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(57) **ABSTRACT**

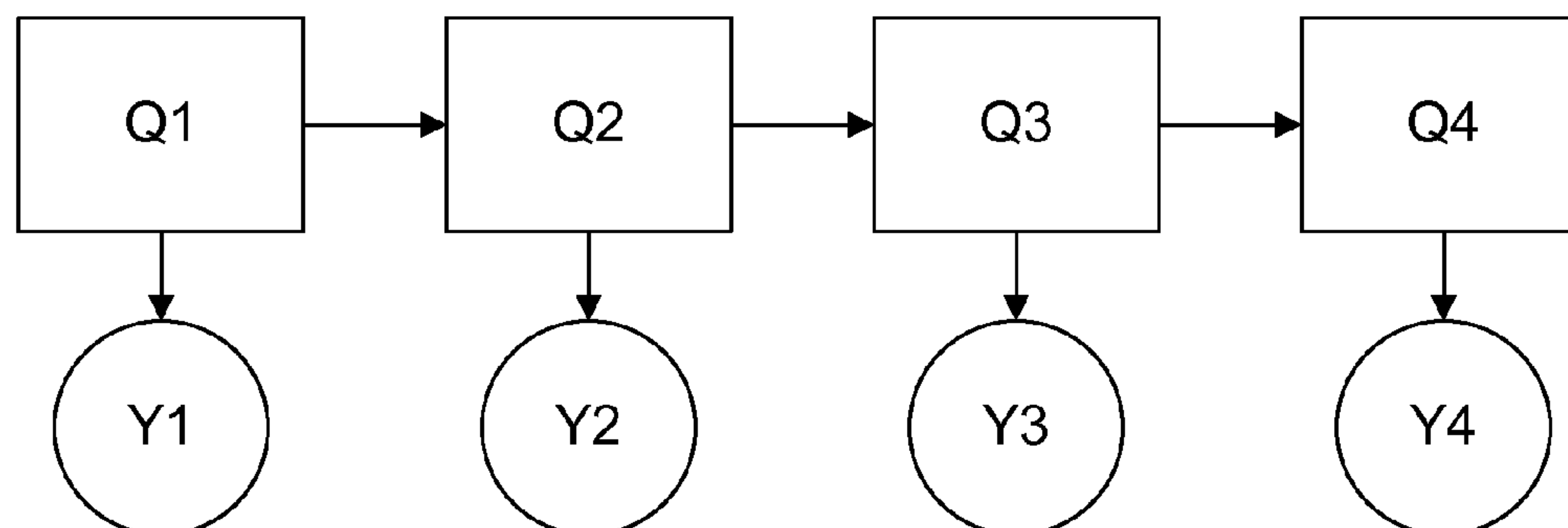
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A system and method providing for communication and reo-
lution of utility functions between participants, wherein the
utility function is evaluated based on local information at the
recipient to determine a cost value thereof. A user interface
having express representation of both information elements,
and associated reliability of the information. An automated
system for optimally conveying information based on rel-
evance and reliability.

Related U.S. Application Data

(62) Division of application No. 10/771,182, filed on Feb. 3, 2004.



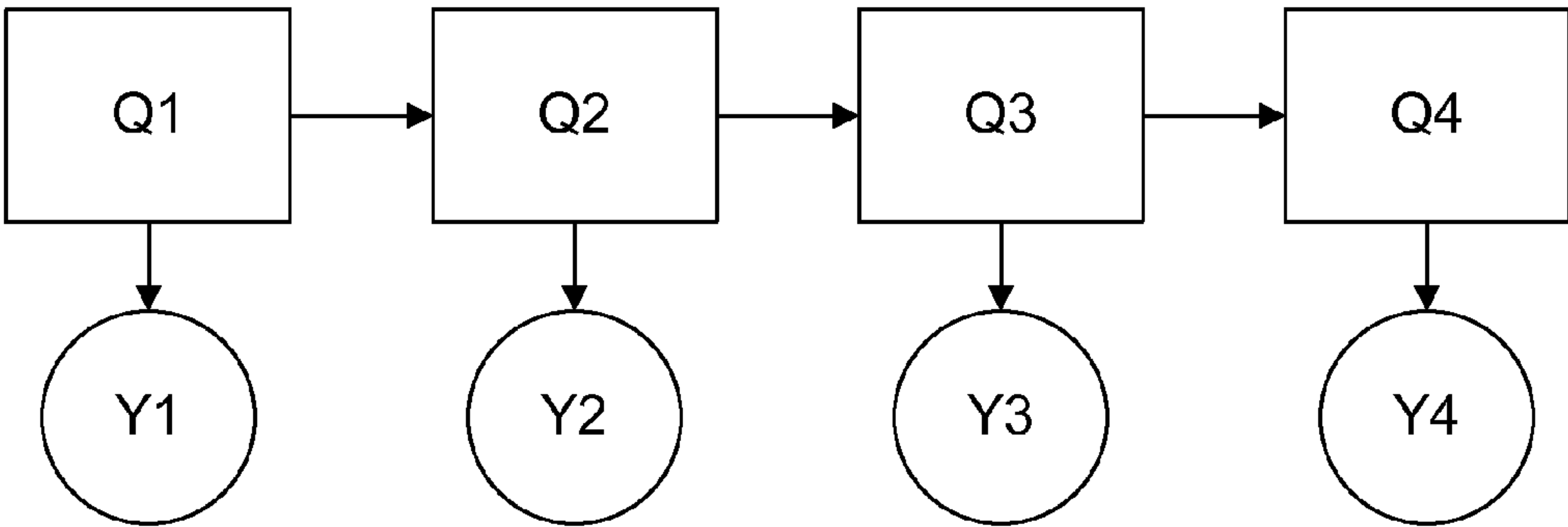


Fig. 1

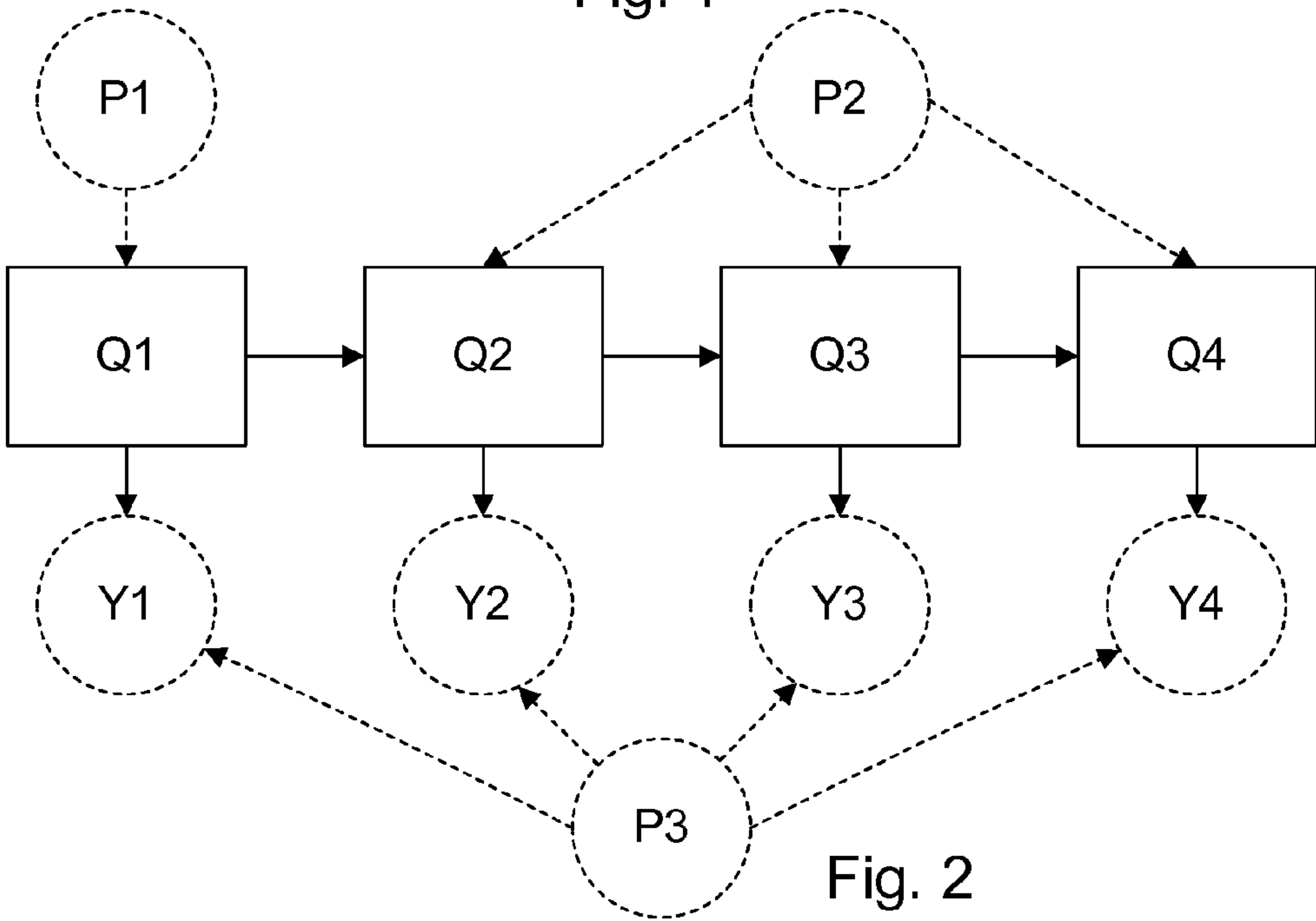
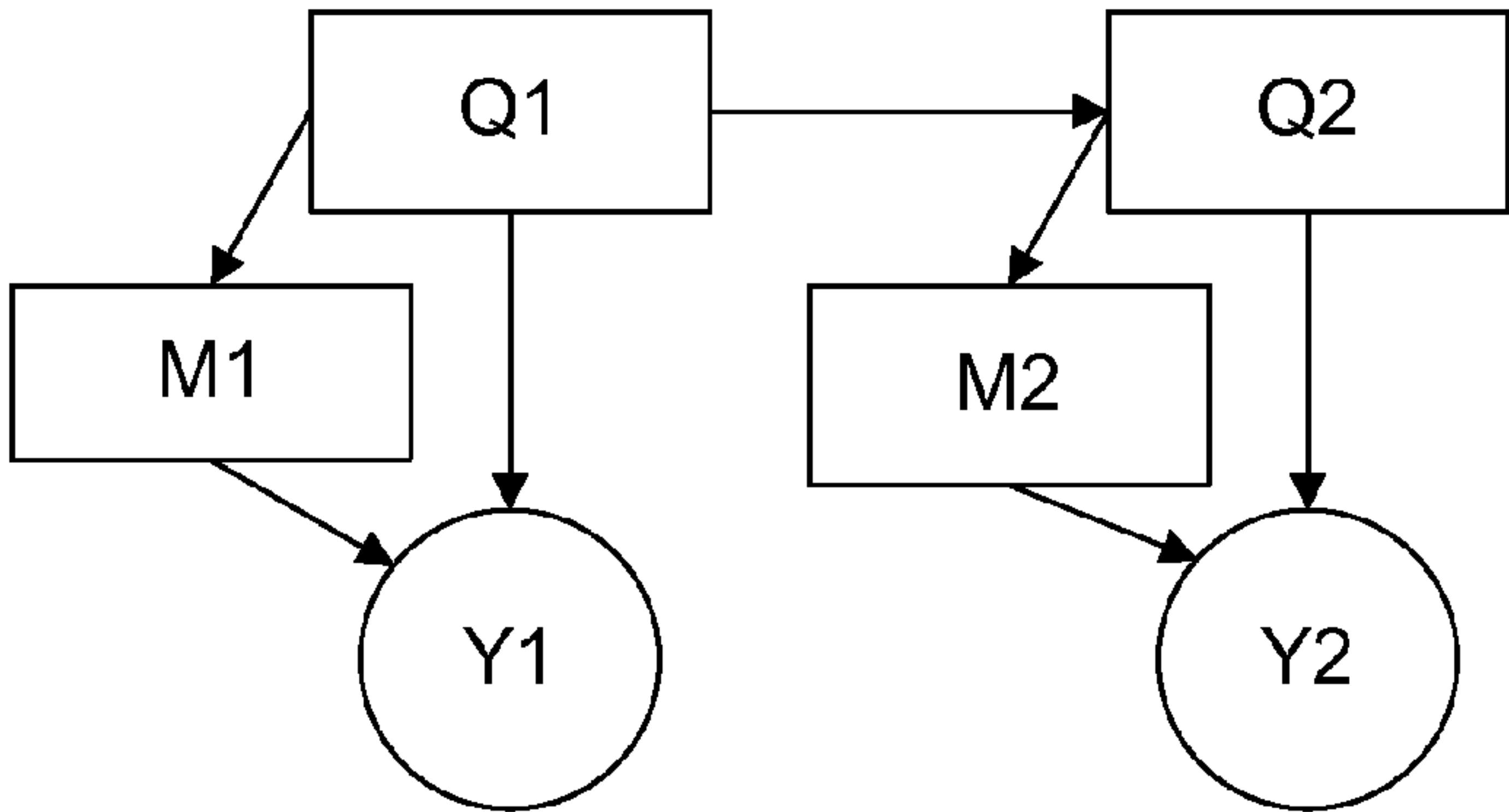


Fig. 2



HMM with mixture of Gaussians output
Fig. 3

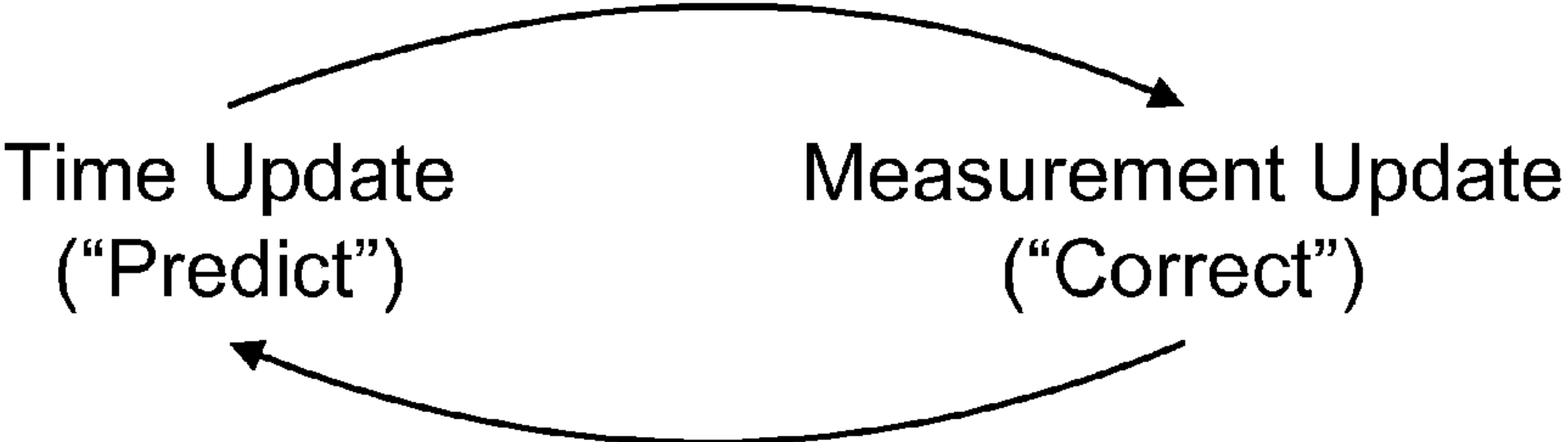
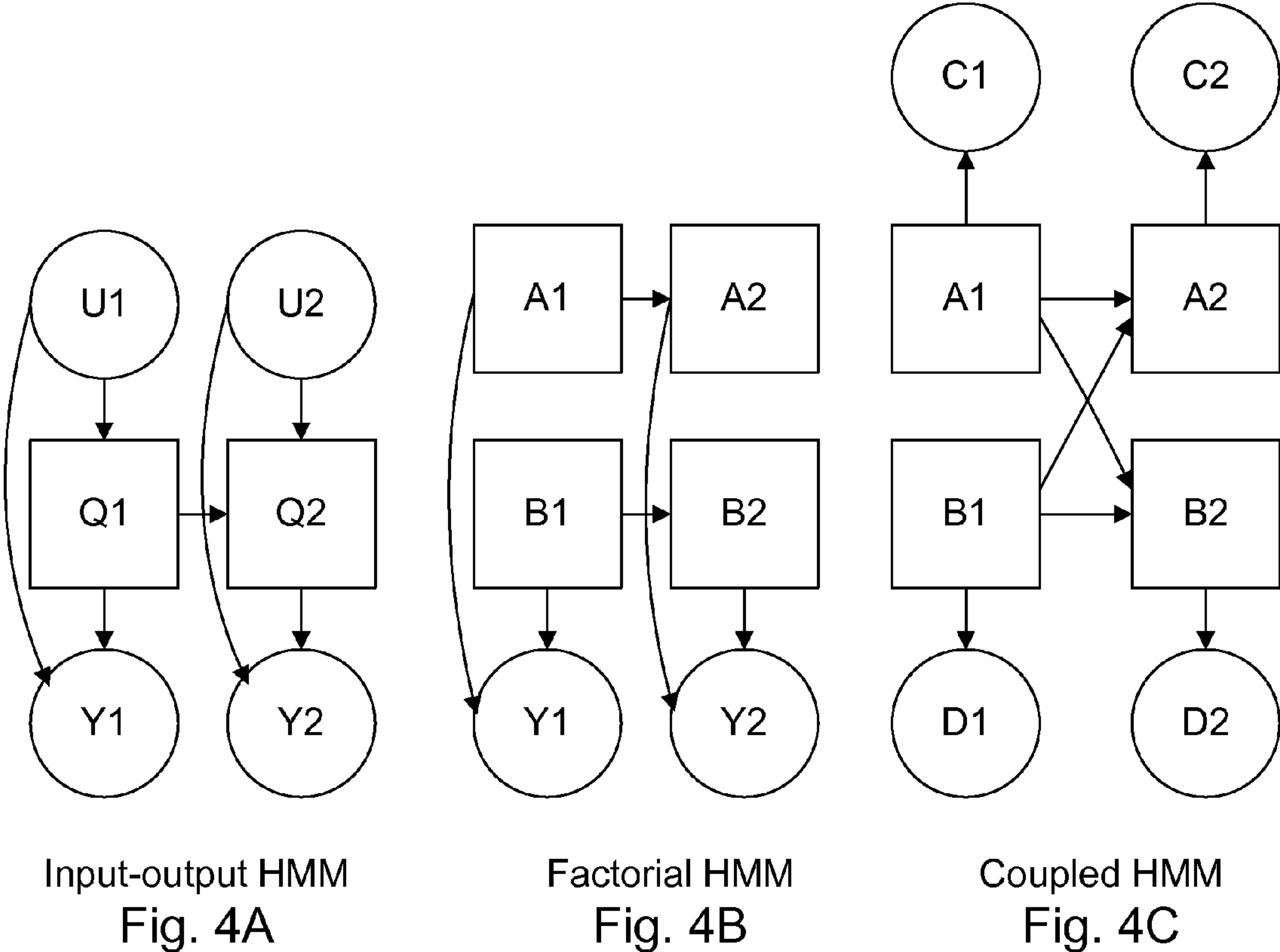
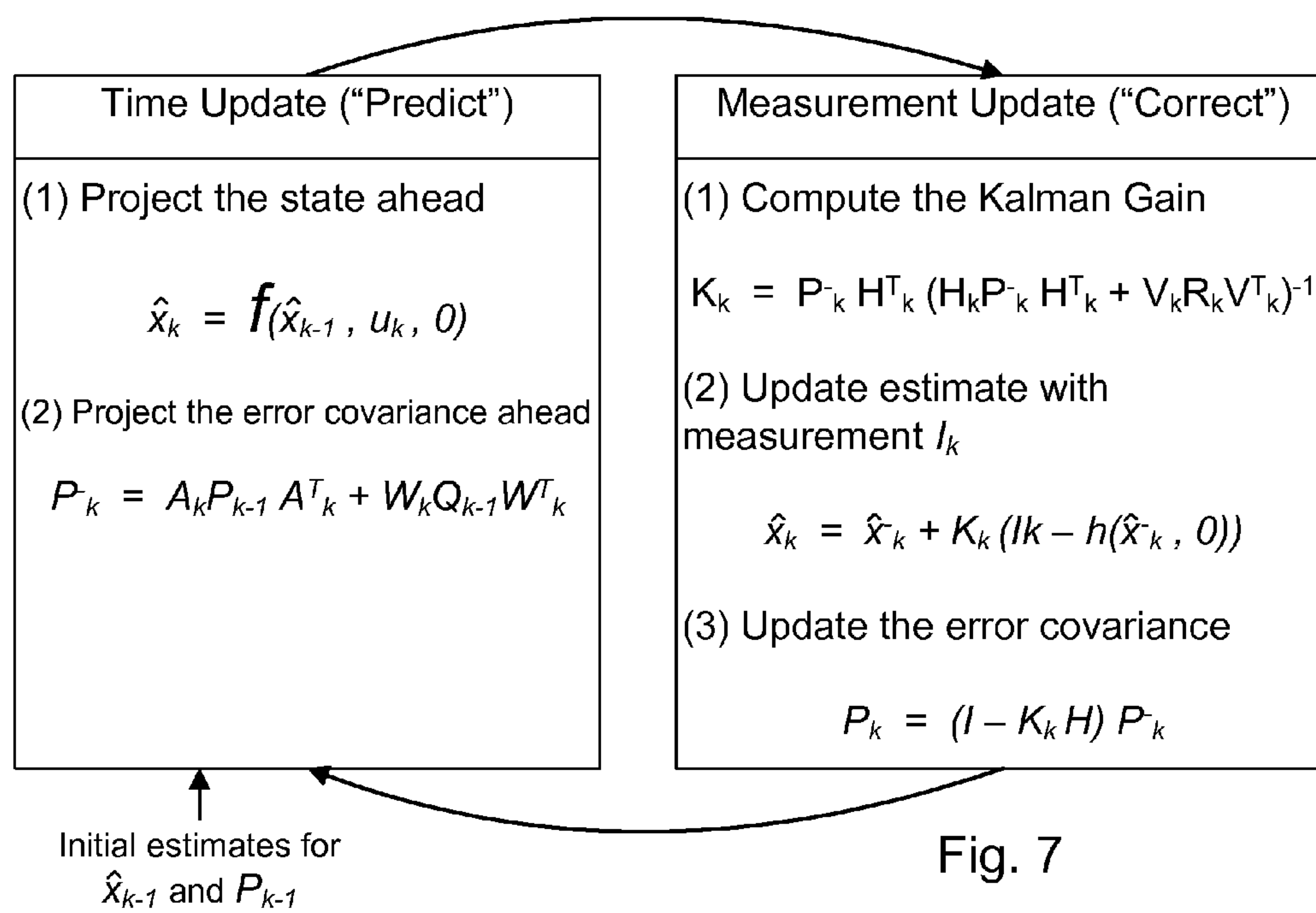
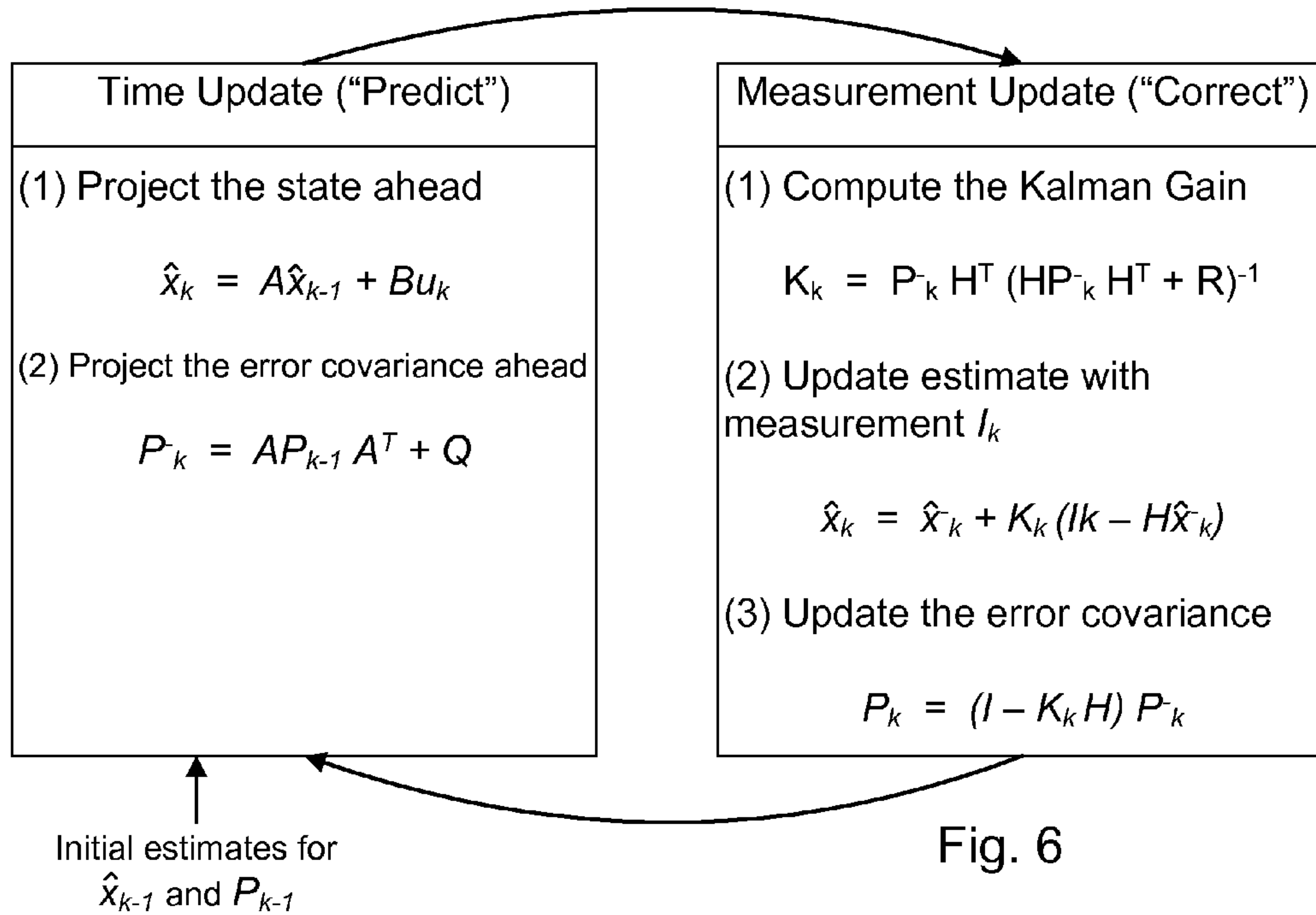
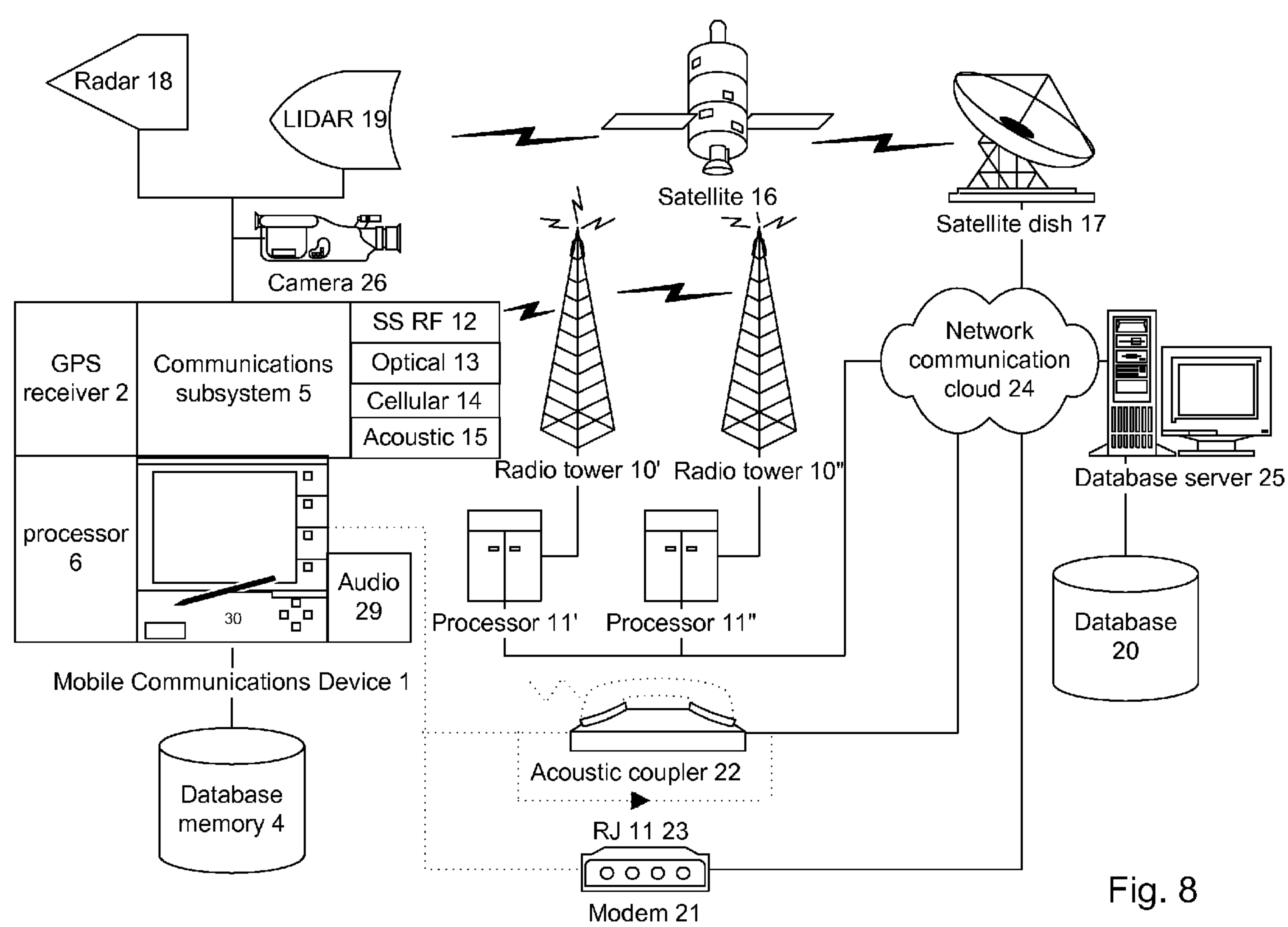


Fig. 5





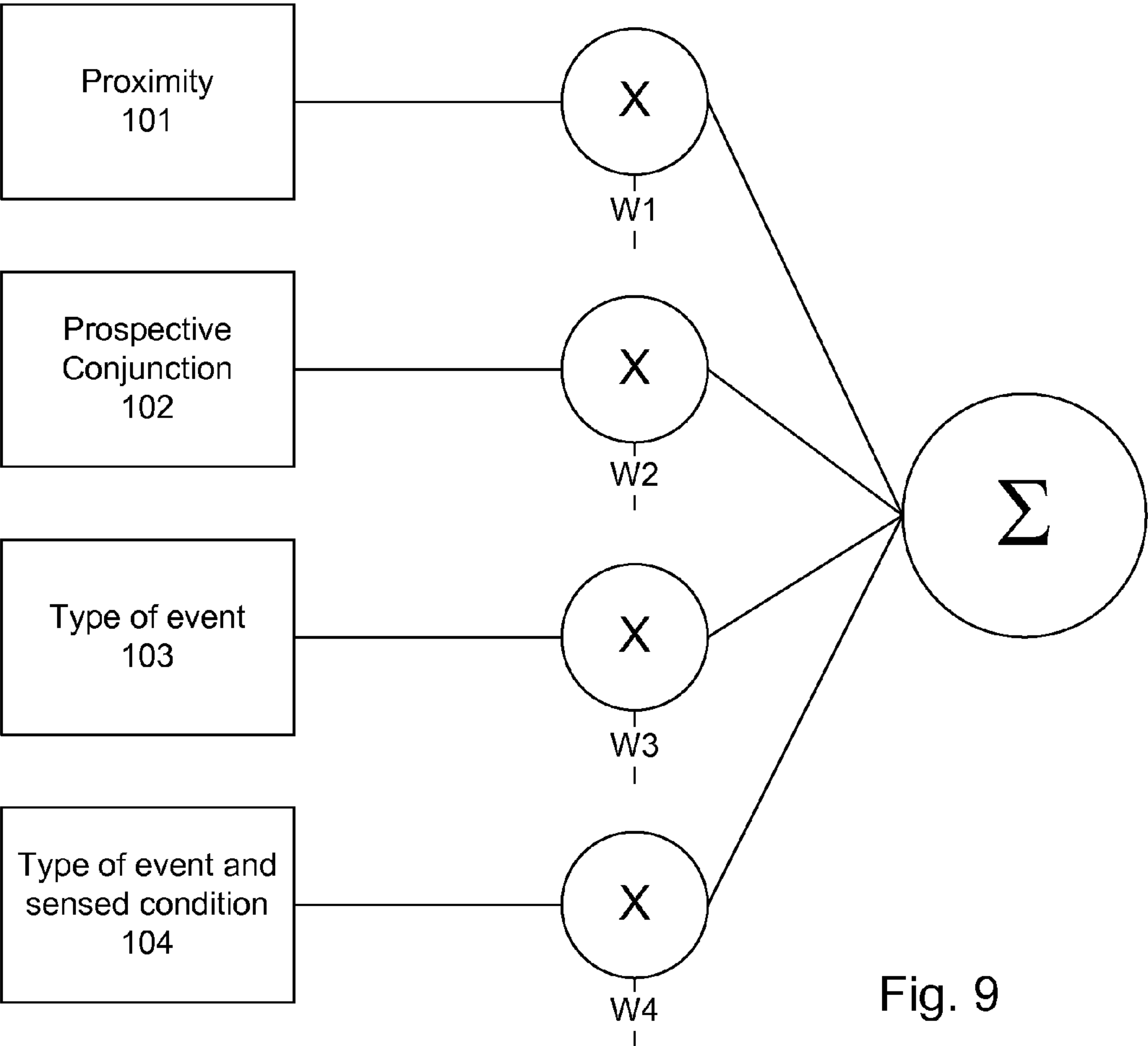


Fig. 9

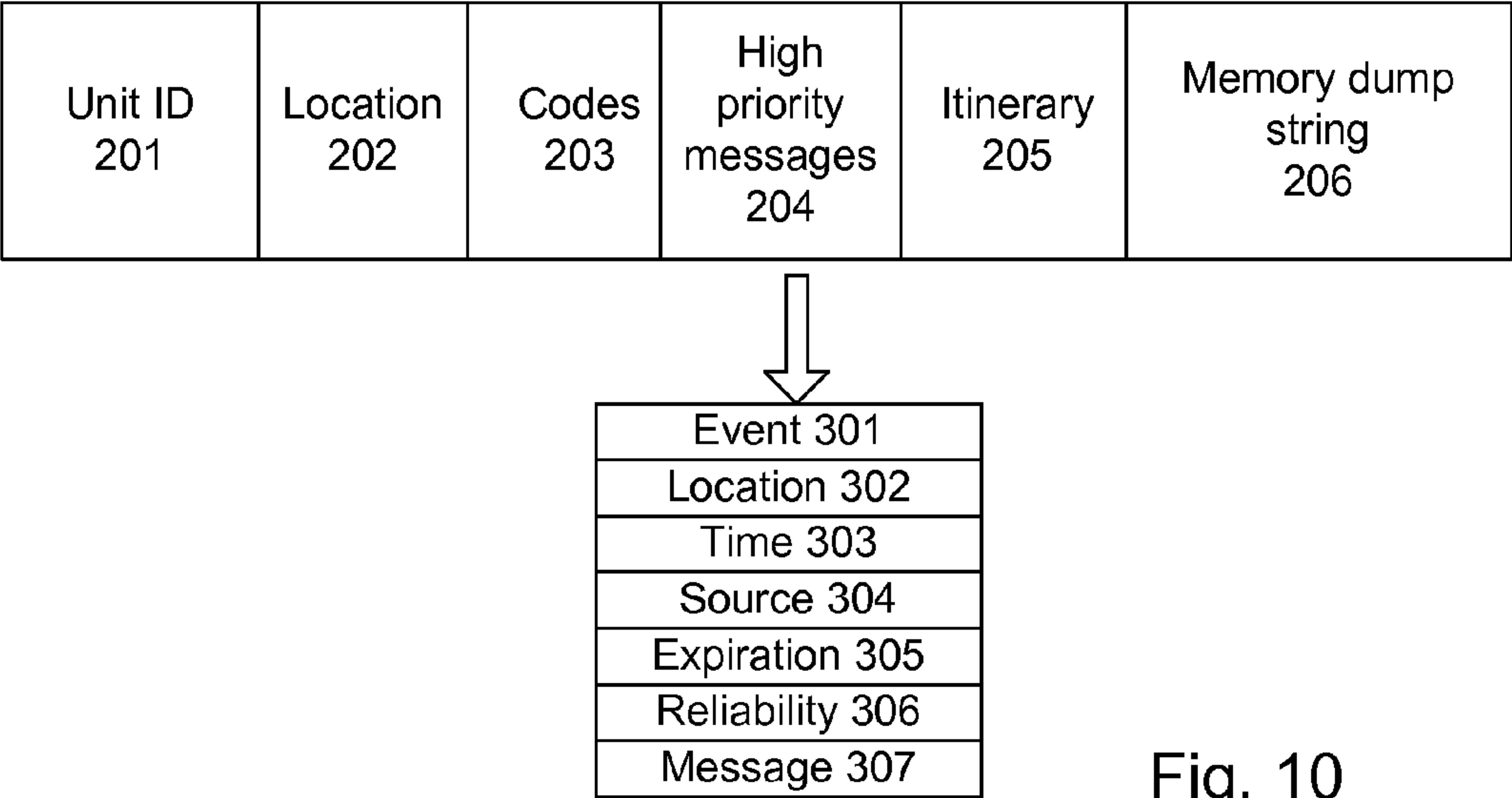


Fig. 10

SYSTEM AND METHOD

BACKGROUND OF THE INVENTION

[0001] A number of fields of endeavor are relevant to the present invention, and exemplary prior art, incorporated herein by reference, are disclosed below. The references disclosed provide a skilled artisan with embodiments of elements of the present invention, and the teachings therein may be combined and subcombined in various manners in accordance with the present teachings. The topical headings are advisory only, and are not intended to limit the applicability of any reference. While some embodiments are discussed as being preferred, it should be understood that all embodiments discussed, in any portion of this documents, whether stated as having advantages or not, form a part of the invention and may be combined and/or subcombined in a consistent manner in accordance with the teachings hereof.

[0002] Internet

[0003] The Internet is structured such various networks are interconnected, with communications effected by addressed packets conforming to a common protocol. Based on the packet addressing, information is routed from source to destination, often through a set of networks having multiple potential pathways. The communications medium is shared between all users. Statistically, some proportion of the packets are extraordinarily delayed, or simply lost. Therefore, protocols involving communications using these packets include error detection schemes that request a retransmit of required data not received within a time window. In the event that the network nears capacity or is otherwise subject to limiting constraint, the incidence of delayed or lost packets increases, thereby increasing requests for retransmission and retransmission. Therefore, as the network approaches available bandwidth, the load increases, ultimately leading to failure. In instances where a minimum quality of service must be guaranteed, special Internet technologies are required, to reserve bandwidth or to specify network pathways. End-to-end quality of service guarantees, however, may exceed the cost of circuit switched technologies, such as dialup modems, especially where the high quality needs are intermittent.

[0004] Internet usage typically involves an Internet server, an automated system capable of responding to communications received through the Internet, and often communicating with other systems not directly connected to the Internet. The server typically has relatively large bandwidth to the Internet, allowing multiple simultaneous communications sessions, and usually supports the hypertext transport protocol (HTTP), which provides, in conjunction with a so-called web browser on a remote client system, a human readable interface which facilitates navigation of various resources available in the Internet. The client systems are typically human user interfaces, which employ a browser to display HTTP "web pages". The browser typically does not provide intelligence. Bandwidth between the client and Internet is typically relatively small, and various communications and display rendering considered normal. Typically, both client and server are connected to the Internet through Internet service providers, each having its own router.

[0005] It is also known to provide so-called proxy servers and firewalls, which are automated systems that insulate the client system from the Internet. Further, so-called Internet applications and applets are known which provide local intelligence at the client system. Further, it is known to provide a local server within the client system for locally processing a

portion of the information. These local servers, applications and applets are non-standard, and thus require special software to be available locally for execution.

[0006] Thus, the Internet poses a number of advantages for commercial use, including low cost and ubiquitous connectivity. Therefore, it is desirable to employ standard Internet technologies while achieving sufficient quality communications to effect an efficient transaction.

[0007] Market Economy Systems

[0008] In modern retail transactions, predetermined price transactions are common, with market transactions, i.e., commerce conducted in a setting which allows the transaction price to float based on the respective valuation allocated by the buyer(s) and seller(s), often left to specialized fields. While interpersonal negotiation is often used to set a transfer price, this price is often different from a transfer price that might result from a best-efforts attempt at establishing a market price. Assuming that the market price is optimal, it is therefore assumed that alternatives are sub optimal. Therefore, the establishment of a market price is desirable over simple negotiations.

[0009] One particular problem with market-based commerce is that both seller optimization and market efficiency depend on the fact that representative participants of a preselected class are invited to participate, and are able to promptly communicate, on a relevant timescale, in order to accurately value the goods or services and make an offer. Thus, in traditional market-based system, all participants are in the same room, or connected by a high quality telecommunications link. Alternately, the market valuation process is prolonged over an extended period, allowing non-real time communications of market information and bids. Thus, attempts at ascertaining a market price for non-commodity goods can be subject to substantial inefficiencies, which reduce any potential gains by market pricing. Further, while market pricing might be considered "fair", it also imposes an element of risk, reducing the ability of parties to predict future pricing and revenues. Addressing this risk may also reduce efficiency of a market-based system.

[0010] Auction Systems

[0011] When a single party seeks to sell goods to the highest valued purchaser(s), to establish a market price, the rules of conduct typically define an auction. Typically, known auctions provide an ascending price or descending price over time, with bidders making offers or ceasing to make offers, in the descending price or ascending price models, respectively, to define the market price. After determining the winner of the auction, the pricing rules define uniform price auctions, wherein all successful bidders pay the lowest successful bid, second price auctions wherein the winning bidder pays the amount bid by the next highest bidder, and pay-what-you-bid auctions. The pay-what-you-bid auction is also known as a discriminative auction while the uniform price auction is known as a non-discriminative auction. In a second-price auction, also known as a Vickrey auction, the policy seeks to create a disincentive for speculation and to encourage bidders to submit bids reflecting their true value for the good. In the uniform price and second price schemes, the bidder is encouraged to disclose the actual private value to the bidder of the good or service, since at any price below this amount, there is an excess gain to the buyer, whereas by withholding this amount the bid may be unsuccessful, resulting in a loss of the presumably desirable opportunity. In the pay-what-you-bid auction, on the other hand, the buyer need not disclose the

maximum private valuation, and those bidders with lower risk tolerance will bid higher prices. See, www.isoc.org/inet98/proceedings/3b/3b_3.html; www.ibm.com/iac/reports-technical/reports-bus-neg-internet.html.

[0012] Two common types of auction are the English auction, which sells a single good to the highest bidder in an ascending price auction, and the Dutch auction, in which multiple units are available for sale, and in which a starting price is selected by the auctioneer, which is successively reduced, until the supply is exhausted by bidders (or the minimum price/final time is reached), with the buyer(s) paying the lowest successful bid. The term Dutch auction is also applied to a type of sealed bid auction. In a multi-unit live Dutch auction, each participant is provided with the current price, the quantity on hand and the time remaining in the auction. This type of auction, typically takes place over a very short period of time and there is a flurry of activity in the last portion of the auction process. The actual auction terminates when there is no more product to be sold or the time period expires.

[0013] In selecting the optimal type of auction, a number of factors are considered. In order to sell large quantities of a perishable commodity in a short period of time, the descending price auctions are often preferred. For example, the produce and flower markets in Holland routinely use the Dutch auction (hence the derivation of the name), while the U.S. Government uses this form to sell its financial instruments. The format of a traditional Dutch auction encourages early bidders to bid up to their “private value”, hoping to pay some price below the “private value”. In making a bid, the “private value” becomes known, helping to establish a published market value and demand curve for the goods, thus allowing both buyers and sellers to define strategies for future auctions.

[0014] In an auction, typically a seller retains an auctioneer to conduct an auction with multiple buyers. (In a reverse auction, a buyer solicits the lowest price from multiple competing vendors for a desired purchase). Since the seller retains the auctioneer, the seller essentially defines the rules of the auction. These rules are typically defined to maximize the revenues or profit to the seller, while providing an inviting forum to encourage a maximum number of high valued buyers. If the rules discourage high valuations of the goods or services, or discourage participation by an important set of potential bidders, then the rules are not optimum. A rule may also be imposed to account for the valuation of the good or service applied by the seller, in the form of a reserve price. It is noted that these rules typically seek to allocate to the seller a portion of the economic benefit that would normally inure to the buyer, creating an economic inefficiency. However, since the auction is to benefit the seller, not society as a whole, this potential inefficiency is tolerated. An optimum auction thus seeks to produce a maximum profit (or net revenues) for the seller. An efficient auction, on the other hand, maximizes the sum of the utilities for the buyer and seller. It remains a subject of academic debate as to which auction rules are most optimum in given circumstances; however, in practice, simplicity of implementation may be a paramount concern, and simple auctions may result in highest revenues; complex auctions, while theoretically more optimal, may discourage bidders from participating or from applying their true and full private valuation in the auction process.

[0015] Typically, the rules of the auction are predefined and invariant. Further, for a number of reasons, auctions typically apply the same rules to all bidders, even though, with a priori

knowledge of the private values assigned by each bidder to the goods, or a prediction of the private value, an optimization rule may be applied to extract the full value assigned by each bidder, while selling above the sellers reserve.

[0016] In a known ascending price auction, each participant must be made aware of the status of the auction, e.g., open, closed, and the contemporaneous price. A bid is indicated by the identification of the bidder at the contemporaneous price, or occasionally at any price above the minimum bid increment plus the previous price. The bids are asynchronous, and therefore each bidder must be immediately informed of the particulars of each bid by other bidders.

[0017] In a known descending price auction, the process traditionally entails a common clock, which corresponds to a decrementing price at each decrement interval, with an ending time (and price). Therefore, once each participant is made aware of the auction parameters, e.g., starting price, price decrement, ending price/time, before the start of the auction, the only information that must be transmitted is auction status (e.g., inventory remaining).

[0018] As stated above, an auction is traditionally considered an efficient manner of liquidating goods at a market price. The theory of an auction is that either the buyer will not resell, and thus has an internal or private valuation of the goods regardless of other’s perceived values, or that the winner will resell, either to gain economic efficiency or as a part of the buyers regular business. In the later case, it is a general presumption that the resale buyers are not in attendance at the auction or are otherwise precluded from bidding, and therefore that, after the auction, there will remain demand for the goods at a price in excess of the price paid during the auction. Extinction of this residual demand results in the so-called “winner’s curse”, in which the buyer can make no profit from the transaction during the auction. Since this detracts from the value of the auction as a means of conducting profitable commerce, it is of concern to both buyer and seller. In fact, experience with initial public offerings (IPOs) of stock through various means has demonstrated that by making stock available directly to all classes of potential purchasers, latent demand for a new issue is extinguished, and the stock price is likely to decline after issuance, resulting in an IPO which is characterized as “unsuccessful”. This potential for post IPO decline tempers even initial interest in the issue, resulting in a paradoxical decline in revenues from the vehicle. In other words, the “money on the table” resulting from immediate re trading of IPO shares is deemed a required aspect of the IPO process. Thus, methods that retain latent demand after IPO shares result in post IPO increases, and therefore a “successful” IPO. Therefore, where the transaction scheme anticipates demand for resale after the initial distribution, it is often important to assure a reasonable margin for resellers and limitations on direct sale to ultimate consumers.

[0019] Research into auction theory (game theory) shows that in an auction, the goal of the seller is to optimize the auction by allocating the goods inefficiently, and thus to appropriate to himself an excess gain. This inefficiency manifests itself by either withholding goods from the market or placing the goods in the wrong hands. In order to assure for the seller a maximum gain from a misallocation of the goods, restrictions on resale are imposed; otherwise, post auction trading will tend to undue the misallocation, and the anticipation of this trading will tend to control the auction pricing. The misallocation of goods imposed by the seller through

restrictions allow the seller to achieve greater revenues than if free resale were permitted. It is believed that in an auction followed by perfect resale, that any mis-assignment of the goods lowers the seller's revenues below the optimum and likewise, in an auction market followed by perfect resale, it is optimal for the seller to allocate the goods to those with the highest value. Therefore, if post-auction trading is permitted, the seller will not benefit from these later gains, and the seller will obtain sub optimal revenues.

[0020] These studies, however, typically do not consider transaction costs and internal inefficiencies of the resellers, as well as the possibility of multiple classes of purchasers, or even multiple channels of distribution, which may be subject to varying controls or restrictions, and thus in a real market, such theoretical optimal allocation is unlikely. In fact, in real markets the transaction costs involved in transfer of ownership are often critical in determining a method of sale and distribution of goods. For example, it is the efficiency of sale that motivates the auction in the first place. Yet, the auction process itself may consume a substantial margin, for example 1-15% of the transaction value. To presume, even without externally imposed restrictions on resale, that all of the efficiencies of the market may be extracted by free reallocation, ignores that the motivation of the buyer is a profitable transaction, and the buyer may have fixed and variable costs on the order of magnitude of the margin. Thus, there are substantial opportunities for the seller to gain enhanced revenues by defining rules of the auction, strategically allocating inventory amount and setting reserve pricing.

[0021] Therefore, perfect resale is but a fiction created in auction (game) theory. Given this deviation from the ideal presumptions, auction theory may be interpreted to provide the seller with a motivation to misallocate or withhold based on the deviation of practice from theory, likely based on the respective transaction costs, seller's utility of the goods, and other factors not considered by the simple analyses.

[0022] A number of proposals have been made for effecting auction systems using the Internet. These systems include consumer-to-consumer, business-to-consumer, and business-to-business types. Generally, these auctions, of various types and implementations discussed further below, are conducted through Internet browsers using hypertext markup language (HTML) "web pages", using HTTP. In some instances, such as BIDWATCH, discussed further below, an application with associated applets is provided to define a user interface instead of HTML.

[0023] As stated above, the information packets from the transaction server to client systems associated with respective bidders communicate various information regarding the status of an interactive auction during the progress thereof. The network traffic from the client systems to the transaction server is often limited to the placement of bids; however, the amount of information required to be transmitted can vary greatly, and may involve a complex dialogue of communications to complete the auction offer. Typically, Internet based auction systems have scalability issues, wherein economies of scale are not completely apparent, leading to implementation of relatively large transaction server systems to handle peak loads. When the processing power of the transaction server system is exceeded, entire system outages may occur, resulting in lost sales or diminished profits, and diminished goodwill.

[0024] In most Internet auction system implementations, there are a large quantity of simultaneous auctions, with each

auction accepting tens or hundreds of bids over a timescale of hours to days. In systems where the transaction volume exceeds these scales, for example in stock and commodity exchanges, which can accommodate large numbers of transactions per second involving the same issue, a private network, or even a local area network, is employed, and the public Internet is not used as a direct communications system with the transaction server. Thus, while infrastructures are available to allow successful handling of massive transaction per second volumes, these systems typically avoid direct public Internet communications or use of some of its limiting technologies. The transaction processing limitations are often due to the finite time required to handle, e.g., open, update, and close, database records.

[0025] In business-to-business auctions, buyers seek to ensure that the population of ultimate consumers for the good or services are not present at the auction, in order to avoid the "winner's curse", where the highest bidder in the auction cannot liquidate or work the asset at a profit. Thus, business-to-business auctions are distinct from business-to-consumer auctions. In the former, the optimization by the seller must account for the desire or directive of the seller to avoid direct retail distribution, and instead to rely on a distribution tier represented in the auction. In the latter, the seller seeks maximum revenues and to exhaust the possibilities for downstream trade in the goods or services. In fact, these types of auctions may be distinguished by various implementing rules, such as requiring sales tax resale certificates, minimum lot size quantities, preregistration or qualification, support or associated services, or limitations on the title to the goods themselves. The conduct of these auctions may also differ, in that consumer involvement typically is permissive of mistake or indecision, while in a pure business environment professionalism and decisiveness are mandated.

[0026] In many instances, psychology plays an important role in the conduct of the auction. In a live auction, bidders can see each other, and judge the tempo of the auction. In addition, multiple auctions are often conducted sequentially, so that each bidder can begin to understand the other bidder's patterns, including hesitation, bluffing, facial gestures or mannerisms. Thus, bidders often prefer live auctions to remote or automated auctions if the bidding is to be conducted strategically.

[0027] Internet Auctions

[0028] On-line electronic auction systems which allow efficient sales of products and services are well known, for example, EBAY.COM, ONSALE.COM, UBID.COM, and the like. Inverse auctions that allow efficient purchases of product are also known, establishing a market price by competition between sellers. The Internet holds the promise of further improving efficiency of auctions by reducing transaction costs and freeing the "same time-same place" limitations of traditional auctions. This is especially appropriate where the goods may be adequately described by text or images, and thus a physical examination of the goods is not required prior to bidding.

[0029] In existing Internet systems, the technological focus has been in providing an auction system that, over the course of hours to days, allow a large number of simultaneous auctions, between a large number of bidders to occur. These systems must be scalable and have high transaction throughput, while assuring database consistency and overall system reliability. Even so, certain users may selectively exploit known technological limitations and artifacts of the auction

system, including non-real time updating of bidding information, especially in the final stages of an auction.

[0030] Because of existing bandwidth and technological hurdles, Internet auctions are quite different from live auctions with respect to psychological factors. Live auctions are often monitored closely by bidders, who strategically make bids, based not only on the “value” of the goods, but also on an assessment of the competition, timing, psychology, and progress of the auction. It is for this reason that so-called proxy bidding, wherein the bidder creates a preprogrammed “strategy”, usually limited to a maximum price, are disfavored. A maximum price proxy bidding system is somewhat inefficient, in that other bidders may test the proxy, seeking to increase the bid price, without actually intending to purchase, or contrarily, after testing the proxy, a bidder might give up, even below a price he might have been willing to pay. Thus, the proxy imposes inefficiency in the system that effectively increases the transaction cost.

[0031] In order to address a flurry of activity that often occurs at the end of an auction, an auction may be held open until no further bids are cleared for a period of time, even if advertised to end at a certain time. This is common to both live and automated auctions. However, this lack of determinism may upset coordinated schedules, thus impairing efficient business use of the auction system.

[0032] In order to facilitate management of bids and bidding, some of the Internet auction sites have provided non-Hypertext Markup Language (HTML) browser based software “applet” to track auctions. For example, ONSALE.COM has made available a Marimba Castanet® applet called Bidwatch to track auction progress for particular items or classes of items, and to facilitate bidding thereon. This system, however, lacks real-time performance under many circumstances, having a stated refresh period of 10 seconds, with a long latency for confirmation of a bid, due to constraints on software execution, quality of service in communications streams, and bid confirmation dialogue. Thus, it is possible to lose a bid even if an attempt was made prior to another bidder. The need to quickly enter the bid, at risk of being too late, makes the process potentially error prone.

[0033] Proxy bidding, as discussed above, is a known technique for overcoming the constraints of Internet communications and client processing limitations, since it bypasses the client and telecommunications links and may execute solely on the host system or local thereto. However, proxy bidding undermines some of the efficiencies gained by a live market.

[0034] U.S. Pat. No. 5,890,138 to Godin, et al. (Mar. 30, 1999), expressly incorporated herein by reference in its entirety, relates to an Internet auction system. The system implements a declining price auction process, removing a user from the auction process once an indication to purchase has been received. See, Rockoff, T. E., Groves, M.; “Design of an Internet-based System for Remote Dutch Auctions”, Internet Research, v 5, n 4, pp. 10-16, MCB University Press, Jan. 1, 1995.

[0035] A known computer site for auctioning a product on-line comprises at least one web server computer designed for serving a host of computer browsers and providing the browsers with the capability to participate in various auctions, where each auction is of a single product, at a specified time, with a specified number of the product available for sale. The web server cooperates with a separate database computer, separated from the web server computer by a firewall. The database computer is accessible to the web computer server

computer to allow selective retrieval of product information, which includes a product description, the quantity of the product to be auctioned, a start price of the product, and an image of the product. The web server computer displays, updated during an auction, the current price of the product, the quantity of the product remaining available for purchase and the measure of the time remaining in the auction. The current price is decreased in a predetermined manner during the auction. Each user is provided with an input instructing the system to purchase the product at a displayed current price, transmitting an identification and required financial authorization for the purchase of the product, which must be confirmed within a predetermined time. In the known system, a certain fall-out rate in the actual purchase confirmation may be assumed, and therefore some overselling allowed. Further, after a purchase is indicated, the user’s screen is not updated, obscuring the ultimate lowest selling price from the user. However, if the user maintains a second browser, he can continue to monitor the auction to determine whether the product could have been purchased at a lower price, and if so, fail to confirm the committed purchase and purchase the same goods at a lower price while reserving the goods to avoid risk of loss. Thus, the system is flawed, and may fail to produce an efficient transaction or optimal price.

[0036] An Internet declining price auction system may provide the ability to track the price demand curve, providing valuable marketing information. For example, in trying to determine the response at different prices, companies normally have to conduct market surveys. In contrast, with a declining price auction, substantial information regarding price and demand is immediately known. The relationship between participating bidders and average purchasers can then be applied to provide a conventional price demand curve for the particular product.

[0037] U.S. Pat. No. 5,835,896, Fisher, et al., issued Nov. 10, 1998, expressly incorporated herein by reference in its entirety, provides method and system for processing and transmitting electronic auction information over the Internet, between a central transaction server system and remote bidder terminals. Those bids are recorded by the system and the bidders are updated with the current auction status information. When appropriate, the system closes the auction from further bidding and notifies the winning bidders and losers as to the auction outcome. The transaction server posts information from a database describing a lot available for purchase, receives a plurality of bids, stored in a bid database, in response to the information, and automatically categorizes the bids as successful or unsuccessful. Each bid is validated, and an electronic mail message is sent informing the bidder of the bid status. This system employs HTTP, and thus does not automatically update remote terminal screens, requiring the e-mail notification feature.

[0038] The auction rules may be flexible, for example including Dutch-type auctions, for example by implementing a price markdown feature with scheduled price adjustments, and English-type (progressive) auctions, with price increases corresponding to successively higher bids. In the Dutch type auction, the price markdown feature may be responsive to bidding activity over time, amount of bids received, and number of items bid for. Likewise, in the progressive auction, the award price may be dependent on the quantity desired, and typically implements a lowest successful bid price rule. Bids that are below a preset maximum posted selling price are maintained in reserve by the system. If a certain sales volume

is not achieved in a specified period of time, the price is reduced to liquidate demand above the price point, with the new price becoming the posted price. On the other hand, if a certain sales volume is exceeded in a specified period of time, the system may automatically increase the price. These automatic price changes allow the seller to respond quickly to market conditions while keeping the price of the merchandise as high as possible, to the seller's benefit. A "Proxy Bidding" feature allows a bidder to place a bid for the maximum amount they are willing to pay, keeping this value a secret, displaying only the amount necessary to win the item up to the amount of the currently high bids or proxy bids of other bidders. This feature allows bidders to participate in the electronic auction without revealing to the other bidders the extent to which they are willing to increase their bids, while maintaining control of their maximum bid without closely monitoring the bidding. The feature assures proxy bidders the lowest possible price up to a specified maximum without requiring frequent inquiries as to the state of the bidding.

[0039] A "Floating Closing Time" feature may also be implemented whereby the auction for a particular item is automatically closed if no new bids are received within a predetermined time interval, assuming an increasing price auction. Bidders thus have an incentive to place bids expeditiously, rather than waiting until near the anticipated close of the auction.

[0040] U.S. Pat. No. 5,905,975, Ausubel, issued May 18, 1999, expressly incorporated herein by reference in its entirety, relates to computer implemented methods and apparatus for auctions. The proposed system provides intelligent systems for the auctioneer and for the user. The auctioneer's system contains information from a user system based on bid information entered by the user. With this information, the auctioneer's system determines whether the auction can be concluded or not and appropriate messages are transmitted. At any point in the auction, bidders are provided the opportunity to submit not only their current bids, but also to enter future bids, or bidding rules which may have the opportunity to become relevant at future times or prices, into the auction system's database. Participants may revise their executory bids, by entering updated bids. Thus, at one extreme, a bidder who wishes to economize on his time may choose to enter his entire set of bidding rules into the computerized system at the start of the auction, effectively treating this as a sealed-bid auction. At the opposite extreme, a bidder who wishes to closely participate in the auction may choose to constantly monitor the auction's progress and to submit all of his bids in real time. See also, U.S. patent application Ser. No. 08/582,901 filed Jan. 4, 1996, which provides a method for auctioning multiple, identical objects and close substitutes.

[0041] Secure Networks

[0042] A number of references relate to secure networks, which are an aspect of various embodiments of the present invention. These references are incorporated herein by reference in their entirety, including U.S. Pat. Nos. 5,933,498 (Schneck, et al., Aug. 3, 1999); 5,978,918 (Scholnick, et al., Nov. 2, 1999); 6,005,943 (Cohen, et al., Dec. 21, 1999); 6,009,526 (Choi, Dec. 28, 1999); 6,021,202 (Anderson, et al., Feb. 1, 2000); 6,021,491 (Renaud, Feb. 1, 2000); 6,021,497 (Bouthillier, et al., Feb. 1, 2000); 6,023,762 (Dean, et al., Feb. 8, 2000); 6,029,245 (Scanlan, Feb. 22, 2000); 6,049,875 (Suzuki, et al., Apr. 11, 2000); 6,055,508 (Naor, et al., Apr. 25, 2000); 6,065,119 (Sandford, II, et al., May 16, 2000); 6,073,

240 (Kurtzberg, et al., Jun. 6, 2000); 6,075,860 (Ketcham, Jun. 13, 2000); and 6,075,861 (Miller, II, Jun. 13, 2000).

[0043] Cryptographic Technology

[0044] U.S. Pat. No. 5,956,408 (Arnold, Sep. 21, 1999), expressly incorporated herein by reference, relates to an apparatus and method for secure distribution of data. Data, including program and software updates, is encrypted by a public key encryption system using the private key of the data sender. The sender also digitally signs the data. The receiver decrypts the encrypted data, using the public key of the sender, and verifies the digital signature on the transmitted data. The program interacts with basic information stored within the confines of the receiver. As result of the interaction, the software updates are installed within the confines of the user, and the basic information stored within the confines of the user is changed.

[0045] U.S. Pat. Nos. 5,982,891 (Ginter, et al., Nov. 9, 1999); 5,949,876 (Ginter, et al., Sep. 7, 1999); and 5,892,900 (Ginter, et al., Apr. 6, 1999), expressly incorporated herein by reference, relate to systems and methods for secure transaction management and electronic rights protection. Electronic appliances, such as computers, help to ensure that information is accessed and used only in authorized ways, and maintain the integrity, availability, and/or confidentiality of the information. Such electronic appliances provide a distributed virtual distribution environment (VDE) that may enforce a secure chain of handling and control, for example, to control and/or meter or otherwise monitor use of electronically stored or disseminated information. Such a virtual distribution environment may be used to protect rights of various participants in electronic commerce and other electronic or electronic-facilitated transactions. Distributed and other operating systems, environments and architectures, such as, for example, those using tamper-resistant hardware-based processors, may establish security at each node. These techniques may be used to support an all-electronic information distribution, for example, utilizing the "electronic highway."

[0046] U.S. Pat. No. 6,009,177 (Sudia, Dec. 28, 1999), expressly incorporated herein by reference, relates to a cryptographic system and method with a key escrow feature that uses a method for verifiably splitting users' private encryption keys into components and for sending those components to trusted agents chosen by the particular users, and provides a system that uses modern public key certificate management, enforced by a chip device that also self-certifies. The methods for key escrow and receiving an escrow certificate are also applied herein to a more generalized case of registering a trusted device with a trusted third party and receiving authorization from that party enabling the device to communicate with other trusted devices. Further preferred embodiments provide for rekeying and upgrading of device firmware using a certificate system, and encryption of stream-oriented data.

[0047] U.S. Pat. No. 6,052,467 (Brands, Apr. 18, 2000), expressly incorporated herein by reference, relates to a system for ensuring that the blinding of secret-key certificates is restricted, even if the issuing protocol is performed in parallel mode. A cryptographic method is disclosed that enables the issuer in a secret-key certificate issuing protocol to issue triples consisting of a secret key, a corresponding public key, and a secret-key certificate of the issuer on the public key, in such a way that receiving parties can blind the public key and the certificate, but cannot blind a predetermined non-trivial predicate of the secret key even when executions of the issuing protocol are performed in parallel.

[0048] U.S. Pat. No. 6,052,780 (Glover, Apr. 18, 2000), expressly incorporated herein by reference, relates to a computer system and process for accessing an encrypted and self-decrypting digital information product while restricting access to decrypted digital information. Some of these problems with digital information protection systems may be overcome by providing a mechanism that allows a content provider to encrypt digital information without requiring either a hardware or platform manufacturer or a content consumer to provide support for the specific form of corresponding decryption. This mechanism can be provided in a manner that allows the digital information to be copied easily for back-up purposes and to be transferred easily for distribution, but which should not permit copying of the digital information in decrypted form. In particular, the encrypted digital information is stored as an executable computer program that includes a decryption program that decrypts the encrypted information to provide the desired digital information, upon successful completion of an authorization procedure by the user. In combination with other mechanisms that track distribution, enforce royalty payments and control access to decryption keys, an improved method is provided for identifying and detecting sources of unauthorized copies. Suitable authorization procedures also enable the digital information to be distributed for a limited number of uses and/or users, thus enabling per-use fees to be charged for the digital information.

[0049] See also, U.S. Pat. Nos. 4,200,770 (Cryptographic apparatus and method); 4,218,582 (Public key cryptographic apparatus and method); 4,264,782 (Method and apparatus for transaction and identity verification); 4,306,111 (Simple and effective public-key cryptosystem); 4,309,569 (Method of providing digital signatures); 4,326,098 (High security system for electronic signature verification); 4,351,982 (RSA Public-key data encryption system having large random prime number generating microprocessor or the like); 4,365,110 (Multiple-destinational cryptosystem for broadcast networks); 4,386,233 (Cryptographic key notarization methods and apparatus); 4,393,269 (Method and apparatus incorporating a one-way sequence for transaction and identity verification); 4,399,323 (Fast real-time public key cryptography); 4,405,829 (Cryptographic communications system and method); 4,438,824 (Apparatus and method for cryptographic identity verification); 4,453,074 (Protection system for intelligent cards); 4,458,109 (Method and apparatus providing registered mail features in an electronic communication system); 4,471,164 (Stream cipher operation using public key cryptosystem); 4,514,592 (Cryptosystem); 4,528,588 (Method and apparatus for marking the information content of an information carrying signal); 4,529,870 (Cryptographic identification, financial transaction, and credential device); 4,558,176 (Computer systems to inhibit unauthorized copying, unauthorized usage, and automated cracking of protected software); 4,567,600 (Method and apparatus for maintaining the privacy of digital messages conveyed by public transmission); 4,575,621 (Portable electronic transaction device and system therefor); 4,578,531 (Encryption system key distribution method and apparatus); 4,590,470 (User authentication system employing encryption functions); 4,595,950 (Method and apparatus for marking the information content of an information carrying signal); 4,625,076 (Signed document transmission system); 4,633,036 (Method and apparatus for use in public-key data encryption system); 5,991,406 (System and method for data recovery); 6,026,379 (System,

method and article of manufacture for managing transactions in a high availability system); 6,026,490 (Configurable cryptographic processing engine and method); 6,028,932 (Copy prevention method and apparatus for digital video system); 6,028,933 (Encrypting method and apparatus enabling multiple access for multiple services and multiple transmission modes over a broadband communication network); 6,028,936 (Method and apparatus for authenticating recorded media); 6,028,937 (Communication device which performs two-way encryption authentication in challenge response format); 6,028,939 (Data security system and method); 6,029,150 (Payment and transactions in electronic commerce system); 6,029,195 (System for customized electronic identification of desirable objects); 6,029,247 (Method and apparatus for transmitting secured data); 6,031,913 (Apparatus and method for secure communication based on channel characteristics); 6,031,914 (Method and apparatus for embedding data, including watermarks, in human perceptible images); 6,034,618 (Device authentication system which allows the authentication function to be changed); 6,035,041 (Optimal-resilience, proactive, public-key cryptographic system and method); 6,035,398 (Cryptographic key generation using biometric data); 6,035,402 (Virtual certificate authority); 6,038,315 (Method and system for normalizing biometric variations to authenticate users from a public database and that ensures individual biometric data privacy); 6,038,316 (Method and system for protection of digital information); 6,038,322 (Group key distribution); 6,038,581 (Scheme for arithmetic operations in finite field and group operations over elliptic curves realizing improved computational speed); 6,038,665 (System and method for backing up computer files over a wide area computer network); 6,038,666 (Remote identity verification technique using a personal identification device); 6,041,122 (Method and apparatus for hiding cryptographic keys utilizing autocorrelation timing encoding and computation); 6,041,123 (Centralized secure communications system); 6,041,357 (Common session token system and protocol); 6,041,408 (Key distribution method and system in secure broadcast communication); 6,041,410 (Personal identification fob); 6,044,131 (Secure digital x-ray image authentication method); 6,044,155 (Method and system for securely archiving core data secrets); 6,044,157 (Microprocessor suitable for reproducing AV data while protecting the AV data from illegal copy and image information processing system using the microprocessor); 6,044,205 (Communications system for transferring information between memories according to processes transferred with the information); 6,044,349 (Secure and convenient information storage and retrieval method and apparatus); 6,044,350 (Certificate meter with selectable indemnification provisions); 6,044,388 (Pseudo-random number generator); 6,044,462 (Method and apparatus for managing key revocation); 6,044,463 (Method and system for message delivery utilizing zero knowledge interactive proof protocol); 6,044,464 (Method of protecting broadcast data by fingerprinting a common decryption function); 6,044,466 (Flexible and dynamic derivation of permissions); 6,044,468 (Secure transmission using an ordinarily insecure network communication protocol such as SNMP); 6,047,051 (Implementation of charging in a telecommunications system); 6,047,066 (Communication method and device); 6,047,067 (Electronic-monetary system); 6,047,072 (Method for secure key distribution over a nonsecure communications network); 6,047,242 (Computer system for protecting software and a method for protecting software);

6,047,268 (Method and apparatus for billing for transactions conducted over the internet); 6,047,269 (Self-contained payment system with circulating digital vouchers); 6,047,374 (Method and apparatus for embedding authentication information within digital data); 6,047,887 (System and method for connecting money modules); 6,049,610 (Method and apparatus for digital signature authentication); 6,049,612 (File encryption method and system); 6,049,613 (Method and apparatus for encrypting, decrypting, and providing privacy for data values); 6,049,671 (Method for identifying and obtaining computer software from a network computer); 6,049,785 (Open network payment system for providing for authentication of payment orders based on a confirmation electronic mail message); 6,049,786 (Electronic bill presentment and payment system which deters cheating by employing hashes and digital signatures); 6,049,787 (Electronic business transaction system with notarization database and means for conducting a notarization procedure); 6,049,838 (Persistent distributed capabilities); 6,049,872 (Method for authenticating a channel in large-scale distributed systems); 6,049,874 (System and method for backing up computer files over a wide area computer network); 6,052,466 (Encryption of data packets using a sequence of private keys generated from a public key exchange); 6,052,467 (System for ensuring that the blinding of secret-key certificates is restricted, even if the issuing protocol is performed in parallel mode); 6,052,469 (Interoperable cryptographic key recovery system with verification by comparison); 6,055,314 (System and method for secure purchase and delivery of video content programs); 6,055,321 (System and method for hiding and extracting message data in multimedia data); 6,055,508 (Method for secure accounting and auditing on a communications network); 6,055,512 (Networked personal customized information and facility services); 6,055,636 (Method and apparatus for centralizing processing of key and certificate life cycle management); 6,055,639 (Synchronous message control system in a Kerberos domain); 6,056,199 (Method and apparatus for storing and reading data); 6,057,872 (Digital coupons for pay televisions); 6,058,187 (Secure telecommunications data transmission); 6,058,188 (Method and apparatus for interoperable validation of key recovery information in a cryptographic system); 6,058,189 (Method and system for performing secure electronic monetary transactions); 6,058,193 (System and method of verifying cryptographic postage evidencing using a fixed key set); 6,058,381 (Many-to-many payments system for network content materials); 6,058,383 (Computationally efficient method for trusted and dynamic digital objects dissemination); 6,061,448 (Method and system for dynamic server document encryption); 6,061,454 (System, method, and computer program for communicating a key recovery block to enable third party monitoring without modification to the intended receiver); 6,061,692 (System and method for administering a meta database as an integral component of an information server); 6,061,789 (Secure anonymous information exchange in a network); 6,061,790 (Network computer system with remote user data encipher methodology); 6,061,791 (Initial secret key establishment including facilities for verification of identity); 6,061,792 (System and method for fair exchange of time-independent information goods over a network); 6,061,794 (System and method for performing secure device communications in a peer-to-peer bus architecture); 6,061,796 (Multi-access virtual private network); 6,061,799 (Removable media for password based authentication in a distributed system); 6,064,723

(Network-based multimedia communications and directory system and method of operation); 6,064,738 (Method for encrypting and decrypting data using chaotic maps); 6,064,740 (Method and apparatus for masking modulo exponentiation calculations in an integrated circuit); 6,064,741 (Method for the computer-aided exchange of cryptographic keys between a user computer unit U and a network computer unit N); 6,064,764 (Fragile watermarks for detecting tampering in images); 6,064,878 (Method for separately permissioned communication); 6,065,008 (System and method for secure font subset distribution); 6,067,620 (Stand alone security device for computer networks); 6,069,647 (Conditional access and content security method); 6,069,952 (Data copyright management system); 6,069,954 (Cryptographic data integrity with serial bit processing and pseudo-random generators); 6,069,955 (System for protection of goods against counterfeiting); 6,069,969 (Apparatus and method for electronically acquiring fingerprint images); 6,069,970 (Fingerprint sensor and token reader and associated methods); 6,070,239 (System and method for executing verifiable programs with facility for using non-verifiable programs from trusted sources); 6,072,870 (System, method and article of manufacture for a gateway payment architecture utilizing a multichannel, extensible, flexible architecture); 6,072,874 (Signing method and apparatus using the same); 6,072,876 (Method and system for depositing private key used in RSA cryptosystem); 6,073,125 (Token key distribution system controlled acceptance mail payment and evidencing system); 6,073,160 (Document communications controller); 6,073,172 (Initializing and reconfiguring a secure network interface); 6,073,234 (Device for authenticating user's access rights to resources and method); 6,073,236 (Authentication method, communication method, and information processing apparatus); 6,073,237 (Tamper resistant method and apparatus); 6,073,238 (Method of securely loading commands in a smart card); 6,073,242 (Electronic authority server); 6,075,864 (Method of establishing secure, digitally signed communications using an encryption key based on a blocking set cryptosystem); 6,075,865 (Cryptographic communication process and apparatus); 6,076,078 (Anonymous certified delivery); 6,076,162 (Certification of cryptographic keys for chipcards); 6,076,163 (Secure user identification based on constrained polynomials); 6,076,164 (Authentication method and system using IC card); 6,076,167 (Method and system for improving security in network applications); 6,078,663 (Communication apparatus and a communication system); 6,078,665 (Electronic encryption device and method); 6,078,667 (Generating unique and unpredictable values); 6,078,909 (Method and apparatus for licensing computer programs using a DSA signature); 6,079,018 (System and method for generating unique secure values for digitally signing documents); 6,079,047 (Unwrapping system and method for multiple files of a container); 6,081,597 (Public key cryptosystem method and apparatus); 6,081,598 (Cryptographic system and method with fast decryption); 6,081,610 (System and method for verifying signatures on documents); 6,081,790 (System and method for secure presentment and payment over open networks); 6,081,893 (System for supporting secured log-in of multiple users into a plurality of computers using combined presentation of memorized password and transportable passport record); 6,192,473 (System and method for mutual authentication and

secure communications between a postage security device and a meter server), each of which is expressly incorporated herein by reference.

[0050] See, also, U.S. Pat. Nos. 6,028,937 (Tatebayashi et al.), 6,026,167 (Aziz), 6,009,171 (Ciacelli et al.) (Content Scrambling System, or “CSS”), 5,991,399 (Graunke et al.), 5,948,136 (Smyers) (IEEE 1394-1995), and 5,915,018 (Aucsmith), expressly incorporated herein by reference, and Jim Wright and Jeff Robillard (Philsar Semiconductor), “Adding Security to Portable Designs”, Portable Design, March 2000, pp. 16-20.

[0051] See also, Stefik, U.S. Pat. Nos. 5,715,403 (System for controlling the distribution and use of digital works having attached usage rights where the usage rights are defined by a usage rights grammar); 5,638,443 (System for controlling the distribution and use of composite digital works); 5,634,012 (System for controlling the distribution and use of digital works having a fee reporting mechanism); and 5,629,980 (System for controlling the distribution and use of digital works), expressly incorporated herein by reference.

[0052] Watermarking

[0053] U.S. Pat. No. 5,699,427 (Chow, et al., Dec. 16, 1997), expressly incorporated herein by reference, relates to a method to deter document and intellectual property piracy through individualization, and a system for identifying the authorized receiver of any particular copy of a document. More specifically, each particular copy of a document is fingerprinted by applying a set of variations to a document, where each variation is a change in data contents, but does not change the meaning or perusal experience of the document. A database associating a set of variants to a receiver is maintained. Thus any variant or copy of that variant can be traced to an authorized receiver.

[0054] See also, U.S. Pat. Nos. 4,734,564 (Transaction system with off-line risk assessment); 4,812,628 (Transaction system with off-line risk assessment); 4,926,325 (Apparatus for carrying out financial transactions via a facsimile machine); 5,235,166 (Data verification method and magnetic media therefor); 5,254,843 (Securing magnetically encoded data using timing variations in encoded data); 5,341,429 (Transformation of ephemeral material); 5,428,683 (Method and apparatus for fingerprinting and authenticating magnetic media); 5,430,279 (Data verification method and magnetic media therefor); 5,521,722 (Image handling facilitating computer aided design and manufacture of documents); 5,546,462 (Method and apparatus for fingerprinting and authenticating various magnetic media); 5,606,609 (Electronic document verification system and method); 5,613,004 (Steganographic method and device); 5,616,904 (Data verification method and magnetic media therefor); 5,636,292 (Steganography methods employing embedded calibration data); 5,646,997 (Method and apparatus for embedding authentication information within digital data); 5,659,726 (Data embedding); 5,664,018 (Watermarking process resilient to collusion attacks); 5,687,236 (Steganographic method and device); 5,710,834 (Method and apparatus responsive to a code signal conveyed through a graphic image); 5,727,092 (Compression embedding); 5,734,752 (Digital watermarking using stochastic screen patterns); 5,740,244 (Method and apparatus for improved fingerprinting and authenticating various magnetic media); 5,745,569 (Method for stega-cipher protection of computer code); 5,745,604 (Identification/authentication system using robust, distributed coding); 5,748,763 (Image steganography system featuring perceptually adaptive and

globally scalable signal embedding); 5,748,783 (Method and apparatus for robust information coding); 5,761,686 (Embedding encoded information in an iconic version of a text image); 5,765,152 (System and method for managing copyrighted electronic media); 5,768,426 (Graphics processing system employing embedded code signals); 5,778,102 (Compression embedding); 5,790,703 (Digital watermarking using conjugate halftone screens); 5,819,289 (Data embedding employing degenerate clusters of data having differences less than noise value); 5,822,432 (Method for human-assisted random key generation and application for digital watermark system); 5,822,436 (Photographic products and methods employing embedded information); 5,832,119 (Methods for controlling systems using control signals embedded in empirical data); 5,841,886 (Security system for photographic identification); 5,841,978 (Network linking method using steganographically embedded data objects); 5,848,155 (Spread spectrum watermark for embedded signalling); 5,850,481 (Steganographic system); 5,862,260 (Methods for surveying dissemination of proprietary empirical data); 5,878,137 (Method for obtaining authenticity identification devices for using services in general, and device obtained thereby); 5,889,868 (Optimization methods for the insertion, protection, and detection of digital watermarks in digitized data); 5,892,900 (Systems and methods for secure transaction management and electronic rights protection); 5,905,505 (Method and system for copy protection of on-screen display of text); 5,905,800 (Method and system for digital watermarking); 5,915,027 (Digital watermarking); 5,920,628 (Method and apparatus for fingerprinting and authenticating various magnetic media); 5,930,369 (Secure spread spectrum watermarking for multimedia data); 5,933,498 (System for controlling access and distribution of digital property); 5,943,422 (Steganographic techniques for securely delivering electronic digital rights management control information over insecure communication channels); 5,946,414 (Encoding data in color images using patterned color modulated image regions); 5,949,885 (Method for protecting content using watermarking); 5,974,548 (Media-independent document security method and apparatus); 5,995,625 (Electronic cryptographic packing); 6,002,772 (Data management system); 6,004,276 (Open architecture cardiology information system); 6,006,328 (Computer software authentication, protection, and security system); 6,006,332 (Rights management system for digital media); 6,018,801 (Method for authenticating electronic documents on a computer network); 6,026,193 (Video steganography); 6,044,464 (Method of protecting broadcast data by fingerprinting a common decryption function); 6,047,374 (Method and apparatus for embedding authentication information within digital data); 6,049,627 (Covert digital identifying indicia for digital image); 6,061,451 (Apparatus and method for receiving and decrypting encrypted data and protecting decrypted data from illegal use); 6,064,737 (Anti-piracy system for wireless telephony); 6,064,764 (Fragile watermarks for detecting tampering in images); 6,069,914 (Watermarking of image data using MPEG/JPEG coefficients); 6,076,077 (Data management system); 6,081,793 (Method and system for secure computer moderated voting), each of which is expressly incorporated herein by reference.

[0055] Role-Based Access

[0056] U.S. Pat. No. 6,023,765 (Kuhn, Feb. 8, 2000; Implementation of role-based access control in multi-level secure systems), expressly incorporated herein by reference, relates

to a system and method for implementation of role-based access control in multi-level secure systems. Role-based access control (RBAC) is implemented on a multi-level secure (MLS) system by establishing a relationship between privileges within the RBAC system and pairs of levels and compartments within the MLS system. The advantages provided by RBAC, that is, reducing the overall number of connections that must be maintained, and, for example, greatly simplifying the process required in response to a change of job status of individuals within an organization, are then realized without loss of the security provided by MLS. A trusted interface function is developed to ensure that the RBAC rules permitting individual's access to objects are followed rigorously, and provides a proper mapping of the roles to corresponding pairs of levels and compartments. No other modifications are necessary. Access requests from subjects are mapped by the interface function to pairs of levels and compartments, after which access is controlled entirely by the rules of the MLS system.

[0057] See also, U.S. Pat. Nos. 6,073,242 (Electronic authority server); 6,073,240 (Method and apparatus for realizing computer security); 6,064,977 (Web server with integrated scheduling and calendaring); 6,055,637 (System and method for accessing enterprise-wide resources by presenting to the resource a temporary credential); 6,044,466 (Flexible and dynamic derivation of permissions); 6,041,349 (System management/network correspondence display method and system therefore); 6,014,666 (Declarative and programmatic access control of component-based server applications using roles); 5,991,877 (Object-oriented trusted application framework); 5,978,475 (Event auditing system); 5,949,866 (Communications system for establishing a communication channel on the basis of a functional role or task); 5,925,126 (Method for security shield implementation in computer system's software); 5,911,143 (Method and system for advanced role-based access control in distributed and centralized computer systems); 5,797,128 (System and method for implementing a hierarchical policy for computer system administration); 5,761,288 (Service context sensitive features and applications); 5,751,909 (Database system with methods for controlling object interaction by establishing database contracts between objects); 5,748,890 (Method and system for authenticating and auditing access by a user to non-natively secured applications); 5,621,889 (Facility for detecting intruders and suspect callers in a computer installation and a security system including such a facility); 5,535,383 (Database system with methods for controlling object interaction by establishing database contracts between objects); 5,528,516 (Apparatus and method for event correlation and problem reporting); 5,481,613 (Computer network cryptographic key distribution system); 5,347,578 (Computer system security); 5,265,221 (Access restriction facility method and apparatus), each of which is expressly incorporated herein by reference.

[0058] Computer System Security

[0059] A number of references relate to computer system security, which is a part of various embodiment of the invention. The following references relevant to this issue are incorporated herein by reference: U.S. Pat. Nos. 5,881,225 (Worth, Mar. 9, 1999); 5,937,068 (Audebert, Aug. 10, 1999); 5,949,882 (Angelo, Sep. 7, 1999); 5,953,419 (Lohstroh, et al., Sep. 14, 1999); 5,956,400 (Chaum, et al., Sep. 21, 1999); 5,958,050 (Griffin, et al., Sep. 28, 1999); 5,978,475 (Schneier, et al.,

Nov. 2, 1999); 5,991,878 (McDonough, et al., Nov. 23, 1999); 6,070,239 (McManis, May 30, 2000); and 6,079,021 (Abadi, et al., Jun. 20, 2000).

[0060] Computer Security Devices

[0061] A number of references relate to computer security devices, which is a part of various embodiment of the invention. The following references relevant to this issue are incorporated herein by reference: U.S. Pat. Nos. 5,982,520 (Weiser, et al., Nov. 9, 1999); 5,991,519 (Benhammou, et al., Nov. 23, 1999); 5,999,629 (Heer, et al., Dec. 7, 1999); 6,034,618 (Tatebayashi, et al., Mar. 7, 2000); 6,041,412 (Timson, et al., Mar. 21, 2000); 6,061,451 (Muratani, et al., May 9, 2000); and 6,069,647 (Sullivan, et al., May 30, 2000).

[0062] Virtual Private Network

[0063] A number of references relate to virtual private networks, which is a part of various embodiment of the invention. The following references relevant to this issue are incorporated herein by reference: U.S. Pat. Nos. 6,079,020 (Liu, Jun. 20, 2000); 6,081,900 (Secure intranet access); 6,081,533 (Method and apparatus for an application interface module in a subscriber terminal unit); 6,079,020 (Method and apparatus for managing a virtual private network); 6,078,946 (System and method for management of connection oriented networks); 6,078,586 (ATM virtual private networks); 6,075,854 (Fully flexible routing service for an advanced intelligent network); 6,075,852 (Telecommunications system and method for processing call-independent signalling transactions); 6,073,172 (Initializing and reconfiguring a secure network interface); 6,061,796 (Multi-access virtual private network); 6,061,729 (Method and system for communicating service information in an advanced intelligent network); 6,058,303 (System and method for subscriber activity supervision); 6,055,575 (Virtual private network system and method); 6,052,788 (Firewall providing enhanced network security and user transparency); 6,047,325 (Network device for supporting construction of virtual local area networks on arbitrary local and wide area computer networks); 6,032,118 (Virtual private network service provider for asynchronous transfer mode network); 6,029,067 (Virtual private network for mobile subscribers); 6,016,318 (Virtual private network system over public mobile data network and virtual LAN); 6,009,430 (Method and system for provisioning databases in an advanced intelligent network); 6,005,859 (Proxy VAT-PSTN origination); 6,002,767 (System, method and article of manufacture for a modular gateway server architecture); 6,002,756 (Method and system for implementing intelligent telecommunication services utilizing self-sustaining, fault-tolerant object oriented architecture), each of which is expressly incorporated herein by reference.

[0064] See also, U.S. Pat. Nos. 6,081,900 (Secure intranet access); 6,081,750 (Ergonomic man-machine interface incorporating adaptive pattern recognition based control system); 6,081,199 (Locking device for systems access to which is time-restricted); 6,079,621 (Secure card for E-commerce and identification); 6,078,265 (Fingerprint identification security system); 6,076,167 (Method and system for improving security in network applications); 6,075,455 (Biometric time and attendance system with epidermal topographical updating capability); 6,072,894 (Biometric face recognition for applicant screening); 6,070,141 (System and method of assessing the quality of an identification transaction using an identification quality score); 6,068,184 (Security card and system for use thereof); 6,064,751 (Document and signature data capture system and method); 6,056,197 (Information recording

method for preventing alteration, information recording apparatus, and information recording medium); 6,052,468 (Method of securing a cryptographic key); 6,045,039 (Cardless automated teller transactions); 6,044,349 (Secure and convenient information storage and retrieval method and apparatus); 6,044,155 (Method and system for securely archiving core data secrets); 6,041,410 (Personal identification fob); 6,040,783 (System and method for remote, wireless positive identity verification); 6,038,666 (Remote identity verification technique using a personal identification device); 6,038,337 (Method and apparatus for object recognition); 6,038,315 (Method and system for normalizing biometric variations to authenticate users from a public database and that ensures individual biometric data privacy); 6,037,870 (Detector system for access control, and a detector assembly for implementing such a system); 6,035,406 (Plurality-factor security system); 6,035,402 (Virtual certificate authority); 6,035,398 (Cryptographic key generation using biometric data); 6,031,910 (Method and system for the secure transmission and storage of protectable information); 6,026,166 (Digitally certifying a user identity and a computer system in combination); 6,018,739 (Biometric personnel identification system); 6,016,476 (Portable information and transaction processing system and method utilizing biometric authorization and digital certificate security); 6,012,049 (System for performing financial transactions using a smartcard); 6,012,039 (Tokenless biometric electronic rewards system); 6,011,858 (Memory card having a biometric template stored thereon and system for using same); 6,009,177 (Enhanced cryptographic system and method with key escrow feature); 6,006,328 (Computer software authentication, protection, and security system); 6,003,135 (Modular security device); 6,002,770 (Method for secure data transmission between remote stations); 5,999,637 (Individual identification apparatus for selectively recording a reference pattern based on a correlation with comparative patterns); 5,999,095 (Electronic security system); 5,995,630 (Biometric input with encryption); 5,991,431 (Mouse adapted to scan biometric data); 5,991,429 (Facial recognition system for security access and identification); 5,991,408 (Identification and security using biometric measurements); 5,987,155 (Biometric input device with peripheral port); 5,987,153 (Automated verification and prevention of spoofing for biometric data); 5,986,746 (Topographical object detection system); 5,984,366 (Unalterable self-verifying articles); 5,982,894 (System including separable protected components and associated methods); 5,979,773 (Dual smart card access control electronic data storage and retrieval system and methods); 5,978,494 (Method of selecting the best enroll image for personal identification); 5,974,146 (Real time bank-centric universal payment system); 5,970,143 (Remote-auditing of computer generated outcomes, authenticated billing and access control, and software metering system using cryptographic and other protocols); 5,966,446 (Time-bracketing infrastructure implementation); 5,963,908 (Secure logon to notebook or desktop computers); 5,963,657 (Economical skin-pattern-acquisition and analysis apparatus for access control; systems controlled thereby); 5,954,583 (Secure access control system); 5,952,641 (Security device for controlling the access to a personal computer or to a computer terminal); 5,951,055 (Security document containing encoded data block); 5,949,881 (Apparatus and method for cryptographic companion imprinting); 5,949,879 (Auditable security system for the generation of cryptographically protected digital data); 5,949,046 (Appa-

ratus for issuing integrated circuit cards); 5,943,423 (Smart token system for secure electronic transactions and identification); 5,935,071 (Ultrasonic biometric imaging and identity verification system); 5,933,515 (User identification through sequential input of fingerprints); 5,933,498 (System for controlling access and distribution of digital property); 5,930,804 (Web-based biometric authentication system and method); 5,923,763 (Method and apparatus for secure document timestamping); 5,920,477 (Human factored interface incorporating adaptive pattern recognition based controller apparatus); 5,920,384 (Optical imaging device); 5,920,058 (Holographic labeling and reading machine for authentication and security applications); 5,915,973 (System for administration of remotely-proctored, secure examinations and methods therefor); 5,913,196 (System and method for establishing identity of a speaker); 5,913,025 (Method and apparatus for proxy authentication); 5,912,974 (Apparatus and method for authentication of printed documents); 5,912,818 (System for tracking and dispensing medical items); 5,910,988 (Remote image capture with centralized processing and storage); 5,907,149 (Identification card with delimited usage); 5,901,246 (Ergonomic min-machine interface incorporating adaptive pattern recognition based control system); 5,898,154 (System and method for updating security information in a time-based electronic monetary system); 5,897,616 (Apparatus and methods for speaker verification/identification/classification employing non-acoustic and/or acoustic models and databases); 5,892,902 (Intelligent token protected system with network authentication); 5,892,838 (Biometric recognition using a classification neural network); 5,892,824 (Signature capture/verification systems and methods); 5,890,152 (Personal feedback browser for obtaining media files); 5,889,474 (Method and apparatus for transmitting subject status information over a wireless communications network); 5,881,226 (Computer security system); 5,878,144 (Digital certificates containing multimedia data extensions); 5,876,926 (Method, apparatus and system for verification of human medical data); 5,875,108 (Ergonomic man-machine interface incorporating adaptive pattern recognition based control system); 5,872,849 (Enhanced cryptographic system and method with key escrow feature); 5,872,848 (Method and apparatus for witnessed authentication of electronic documents); 5,872,834 (Telephone with biometric sensing device); 5,870,723 (Tokenless biometric transaction authorization method and system); 5,869,822 (Automated fingerprint identification system); 5,867,802 (Biometrically secured control system for preventing the unauthorized use of a vehicle); 5,867,795 (Portable electronic device with transceiver and visual image display); 5,867,578 (Adaptive multi-step digital signature system and method of operation thereof); 5,862,260 (Methods for surveying dissemination of proprietary empirical data); 5,862,246 (Knuckle profile identity verification system); 5,862,223 (Method and apparatus for a cryptographically-assisted commercial network system designed to facilitate and support expert-based commerce); 5,857,022 (Enhanced cryptographic system and method with key escrow feature); 5,850,451 (Enhanced cryptographic system and method with key escrow feature); 5,850,442 (Secure world wide electronic commerce over an open network); 5,848,231 (System configuration contingent upon secure input); 5,844,244 (Portable identification carrier); 5,841,907 (Spatial integrating optical correlator for verifying the authenticity of a person, product or thing); 5,841,886 (Security system for photographic identification); 5,841,865 (En-

hanced cryptographic system and method with key escrow feature); 5,841,122 (Security structure with electronic smart card access thereto with transmission of power and data between the smart card and the smart card reader performed capacitively or inductively); 5,838,812 (Tokenless biometric transaction authorization system); 5,832,464 (System and method for efficiently processing payments via check and electronic funds transfer); 5,832,119 (Methods for controlling systems using control signals embedded in empirical data); 5,828,751 (Method and apparatus for secure measurement certification); 5,825,880 (Multi-step digital signature method and system); 5,825,871 (Information storage device for storing personal identification information); 5,815,577 (Methods and apparatus for securely encrypting data in conjunction with a personal computer); 5,815,252 (Biometric identification process and system utilizing multiple parameters scans for reduction of false negatives); 5,805,719 (Tokenless identification of individuals); 5,802,199 (Use sensitive identification system); 5,799,088 (Non-deterministic public key encryption system); 5,799,086 (Enhanced cryptographic system and method with key escrow feature); 5,799,083 (Event verification system); 5,790,674 (System and method of providing system integrity and positive audit capabilities to a positive identification system); 5,790,668 (Method and apparatus for securely handling data in a database of biometrics and associated data); 5,789,733 (Smart card with contactless optical interface); 5,787,187 (Systems and methods for biometric identification using the acoustic properties of the ear canal); 5,784,566 (System and method for negotiating security services and algorithms for communication across a computer network); 5,784,461 (Security system for controlling access to images and image related services); 5,774,551 (Pluggable account management interface with unified login and logout and multiple user authentication services); 5,771,071 (Apparatus for coupling multiple data sources onto a printed document); 5,770,849 (Smart card device with pager and visual image display); 5,768,382 (Remote-auditing of computer generated outcomes and authenticated billing and access control system using cryptographic and other protocols); 5,767,496 (Apparatus for processing symbol-encoded credit card information); 5,764,789 (Tokenless biometric ATM access system); 5,763,862 (Dual card smart card reader); 5,761,298 (Communications headset with universally adaptable receiver and voice transmitter); 5,757,916 (Method and apparatus for authenticating the location of remote users of networked computing systems); 5,757,431 (Apparatus for coupling multiple data sources onto a printed document); 5,751,836 (Automated, non-invasive iris recognition system and method); 5,751,809 (Apparatus and method for securing captured data transmitted between two sources); 5,748,738 (System and method for electronic transmission, storage and retrieval of authenticated documents); 5,745,573 (System and method for controlling access to a user secret); 5,745,555 (System and method using personal identification numbers and associated prompts for controlling unauthorized use of a security device and unauthorized access to a resource); 5,742,685 (Method for verifying an identification card and recording verification of same); 5,742,683 (System and method for managing multiple users with different privileges in an open metering system); 5,737,420 (Method for secure data transmission between remote stations); 5,734,154 (Smart card with integrated reader and visual image display); 5,719,950 (Biometric, personal authentication system); 5,712,914 (Digital certificates con-

taining multimedia data extensions); 5,712,912 (Method and apparatus for securely handling a personal identification number or cryptographic key using biometric techniques); 5,706,427 (Authentication method for networks); 5,703,562 (Method for transferring data from an unsecured computer to a secured computer); 5,696,827 (Secure cryptographic methods for electronic transfer of information); 5,682,142 (Electronic control system/network); 5,682,032 (Capacitively coupled identity verification and escort memory apparatus); 5,680,460 (Biometric controlled key generation); 5,668,878 (Secure cryptographic methods for electronic transfer of information); 5,666,400 (Intelligent recognition); 5,659,616 (Method for securely using digital signatures in a commercial cryptographic system); 5,647,364 (Ultrasonic biometric imaging and identity verification system); 5,647,017 (Method and system for the verification of handwritten signatures); 5,646,839 (Telephone-based personnel tracking system); 5,636,282 (Method for dial-in access security using a multimedia modem); 5,633,932 (Apparatus and method for preventing disclosure through user-authentication at a printing node); 5,615,277 (Tokenless security system for authorizing access to a secured computer system); 5,613,012 (Tokenless identification system for authorization of electronic transactions and electronic transmissions); 5,608,387 (Personal identification devices and access control systems); 5,594,806 (Knuckle profile identity verification system); 5,592,408 (Identification card and access control device); 5,588,059 (Computer system and method for secure remote communication sessions); 5,586,171 (Selection of a voice recognition data base responsive to video data); 5,583,950 (Method and apparatus for flash correlation); 5,583,933 (Method and apparatus for the secure communication of data); 5,578,808 (Data card that can be used for transactions involving separate card issuers); 5,572,596 (Automated, non-invasive iris recognition system and method); 5,561,718 (Classifying faces); 5,559,885 (Two stage read-write method for transaction cards); 5,557,765 (System and method for data recovery); 5,553,155 (Low cost method employing time slots for thwarting fraud in the periodic issuance of food stamps, unemployment benefits or other governmental human services); 5,544,255 (Method and system for the capture, storage, transport and authentication of handwritten signatures); 5,534,855 (Method and system for certificate based alias detection); 5,533,123 (Programmable distributed personal security); 5,526,428 (Access control apparatus and method); 5,523,739 (Metal detector for control of access combined in an integrated form with a transponder detector); 5,497,430 (Method and apparatus for image recognition using invariant feature signals); 5,485,519 (Enhanced security for a secure token code); 5,485,312 (Optical pattern recognition system and method for verifying the authenticity of a person, product or thing); 5,483,601 (Apparatus and method for biometric identification using silhouette and displacement images of a portion of a person's hand); 5,478,993 (Process as safety concept against unauthorized use of a payment instrument in cashless payment at payment sites); 5,475,839 (Method and structure for securing access to a computer system); 5,469,506 (Apparatus for verifying an identification card and identifying a person by means of a biometric characteristic); 5,457,747 (Anti-fraud verification system using a data card); 5,455,407 (Electronic-monetary system); 5,453,601 (Electronic-monetary system); 5,448,045 (System for protecting computers via intelligent tokens or smart cards); 5,432,864 (Identification card verification system); 5,414,

755 (System and method for passive voice verification in a telephone network); 5,412,727 (Anti-fraud voter registration and voting system using a data card); 5,363,453 (Non-minutiae automatic fingerprint identification system and methods); 5,347,580 (Authentication method and system with a smartcard); 5,345,549 (Multimedia based security systems); 5,341,428 (Multiple cross-check document verification system); 5,335,288 (Apparatus and method for biometric identification); 5,291,560 (Biometric personal identification system based on iris analysis); 5,283,431 (Optical key security access system); 5,280,527 (Biometric token for authorizing access to a host system); 5,272,754 (Secure computer interface); 5,245,329 (Access control system with mechanical keys which store data); 5,229,764 (Continuous biometric authentication matrix); 5,228,094 (Process of identifying and authenticating data characterizing an individual); 5,224,173 (Method of reducing fraud in connection with employment, public license applications, social security, food stamps, welfare or other government benefits); 5,208,858 (Method for allocating useful data to a specific originator); 5,204,670 (Adaptable electric monitoring and identification system); 5,191,611 (Method and apparatus for protecting material on storage media and for transferring material on storage media to various recipients); 5,163,094 (Method for identifying individuals from analysis of elemental shapes derived from biosensor data); 5,155,680 (Billing system for computing software); 5,131,038 (Portable authentication system); 5,073,950 (Finger profile identification system); 5,067,162 (Method and apparatus for verifying identity using image correlation); 5,065,429 (Method and apparatus for protecting material on storage media); 5,056,147 (Recognition procedure and an apparatus for carrying out the recognition procedure); 5,056,141 (Method and apparatus for the identification of personnel); 5,036,461 (Two-way authentication system between user's smart card and issuer-specific plug-in application modules in multi-issued transaction device); 5,020,105 (Field initialized authentication system for protective security of electronic information networks); 4,993,068 (Unforgettable personal identification system); 4,972,476 (Counterfeit proof ID card having a scrambled facial image); 4,961,142 (Multi-issuer transaction device with individual identification verification plug-in application modules for each issuer); 4,952,928 (Adaptable electronic monitoring and identification system); 4,941,173 (Device and method to render secure the transfer of data between a videotex terminal and a server); 4,926,480 (Card-computer moderated systems); 4,896,363 (Apparatus and method for matching image characteristics such as fingerprint minutiae); 4,890,323 (Data communication systems and methods); 4,868,376 (Intelligent portable interactive personal data system); 4,827,518 (Speaker verification system using integrated circuit cards); 4,819,267 (Solid state key for controlling access to computer systems and to computer software and/or for secure communications); 4,752,676 (Reliable secure, updatable "cash" card system); 4,736,203 (3D hand profile identification apparatus); 4,731,841 (Field initialized authentication system for protective security of electronic information networks); 4,564,018 (Ultrasonic system for obtaining ocular measurements), each of which is expressly incorporated herein by reference.

[0065] Content-Based Query Servers

[0066] U.S. Pat. No. 5,987,459 (Swanson, et al. Nov. 16, 1999), expressly incorporated herein by reference, relates to an image and document management system for content-

based retrieval support directly into the compressed files. The system minimizes a weighted sum of the expected size of the compressed files and the expected query response time. Object searching of documents stored by the system is possible on a scalable resolution basis. The system includes a novel object representation based on embedded prototypes that provides for high-quality browsing of retrieval images at low bit rates.

[0067] U.S. Pat. No. 6,038,560 (Wical, Mar. 14, 2000), expressly incorporated herein by reference, relates to a concept knowledge base search and retrieval system, which includes factual knowledge base queries and concept knowledge base queries, is disclosed. A knowledge base stores associations among terminology/categories that have a lexical, semantic or usage association. Document theme vectors identify the content of documents through themes as well as through classification of the documents in categories that reflects what the documents are primarily about. The factual knowledge base queries identify, in response to an input query, documents relevant to the input query through expansion of the query terms as well as through expansion of themes. The concept knowledge base query does not identify specific documents in response to a query, but specifies terminology that identifies the potential existence of documents in a particular area.

[0068] U.S. Pat. No. 6,067,466 (Selker, et al., May 23, 2000), expressly incorporated herein by reference, relates to a diagnostic tool using a predictive instrument. A method is provided for evaluating a medical condition of a patient including the steps of monitoring one or more clinical features of a patient; based on the monitored features, computing a primary probability of a medical outcome or diagnosis; computing a plurality of conditional probabilities for a selected diagnostic test, the computed conditional probabilities including a first probability of the medical outcome or diagnosis assuming the selected diagnostic test produces a first outcome and a second probability of the medical outcome or diagnosis assuming the selected diagnostic test produces a second outcome; and displaying the computed primary probability as well as the plurality of computed conditional probabilities to a user as an aid to determining whether to administer the selected diagnostic test to the patient.

[0069] E-Commerce Systems

[0070] U.S. Pat. No. 5,946,669 (Polk, Aug. 31, 1999), expressly incorporated herein by reference, relates to a method and apparatus for payment processing using debit-based electronic funds transfer and disbursement processing using addendum-based electronic data interchange. This disclosure describes a payment and disbursement system, wherein an initiator authorizes a payment and disbursement to a collector and the collector processes the payment and disbursement through an accumulator agency. The accumulator agency processes the payment as a debit-based transaction and processes the disbursement as an addendum-based transaction. The processing of a debit-based transaction generally occurs by electronic funds transfer (EFT) or by financial electronic data interchange (FEDI). The processing of an addendum-based transaction generally occurs by electronic data interchange (EDI).

[0071] U.S. Pat. No. 6,005,939 (Fortenberry, et al., Dec. 21, 1999), expressly incorporated herein by reference, relates to a method and apparatus for storing an Internet user's identity and access rights to World Wide Web resources. A method

and apparatus for obtaining user information to conduct secure transactions on the Internet without having to re-enter the information multiple times is described. The method and apparatus can also provide a technique by which secured access to the data can be achieved over the Internet. A passport containing user-defined information at various security levels is stored in a secure server apparatus, or passport agent, connected to computer network. A user process instructs the passport agent to release all or portions of the passport to a recipient node and forwards a key to the recipient node to unlock the passport information.

[0072] U.S. Pat. No. 6,016,484 (Williams, et al., Jan. 18, 2000), expressly incorporated herein by reference, relates to a system, method and apparatus for network electronic payment instrument and certification of payment and credit collection utilizing a payment. An electronic monetary system provides for transactions utilizing an electronic-monetary system that emulates a wallet or a purse that is customarily used for keeping money, credit cards and other forms of payment organized. Access to the instruments in the wallet or purse is restricted by a password to avoid unauthorized payments. A certificate form must be completed in order to obtain an instrument. The certificate form obtains the information necessary for creating a certificate granting authority to utilize an instrument, a payment holder and a complete electronic wallet. Electronic approval results in the generation of an electronic transaction to complete the order. If a user selects a particular certificate, a particular payment instrument holder will be generated based on the selected certificate. In addition, the issuing agent for the certificate defines a default bitmap for the instrument associated with a particular certificate, and the default bitmap will be displayed when the certificate definition is completed. Finally, the number associated with a particular certificate will be utilized to determine if a particular party can issue a certificate.

[0073] U.S. Pat. No. 6,029,150 (Kravitz, Feb. 22, 2000), expressly incorporated herein by reference, relates to a system and method of payment in an electronic payment system wherein a plurality of customers have accounts with an agent. A customer obtains an authenticated quote from a specific merchant, the quote including a specification of goods and a payment amount for those goods. The customer sends to the agent a single communication including a request for payment of the payment amount to the specific merchant and a unique identification of the customer. The agent issues to the customer an authenticated payment advice based only on the single communication and secret shared between the customer and the agent and status information, which the agent knows about the merchant, and/or the customer. The customer forwards a portion of the payment advice to the specific merchant. The specific merchant provides the goods to the customer in response to receiving the portion of the payment advice.

[0074] U.S. Pat. No. 6,047,269 (Biffar, Apr. 4, 2000), expressly incorporated herein by reference, relates to a self-contained payment system with creating and facilitating transfer of circulating digital vouchers representing value. A digital voucher has an identifying element and a dynamic log. The identifying element includes information such as the transferable value, a serial number and a digital signature. The dynamic log records the movement of the voucher through the system and accordingly grows over time. This allows the system operator to not only reconcile the vouchers before redeeming them, but also to recreate the history of

movement of a voucher should an irregularity like a duplicate voucher be detected. These vouchers are used within a self-contained system including a large number of remote devices that are linked to a central system. The central system can be linked to an external system. The external system, as well as the remote devices, is connected to the central system by any one or a combination of networks. The networks must be able to transport digital information, for example the Internet, cellular networks, telecommunication networks, cable networks or proprietary networks. Vouchers can also be transferred from one remote device to another remote device. These remote devices can communicate through a number of methods with each other. For example, for a non-face-to-face transaction the Internet is a choice, for a face-to-face or close proximity transactions tone signals or light signals are likely methods. In addition, at the time of a transaction a digital receipt can be created which will facilitate a fast replacement of vouchers stored in a lost remote device.

[0075] Micropayments

[0076] U.S. Pat. No. 5,999,919 (Jarecki, et al., Dec. 7, 1999), expressly incorporated herein by reference, relates to an efficient micropayment system. Existing software proposals for electronic payments can be divided into “on-line” schemes which require participation of a trusted party (the bank) in every transaction and are secure against overspending, and “off-line” schemes which do not require a third party and guarantee only that overspending is detected when vendors submit their transaction records to the bank (usually at the end of the day). A new “hybrid” scheme is proposed which combines the advantages of both “on-line” and “off-line” electronic payment schemes. It allows for control of overspending at a cost of only a modest increase in communication compared to the off-line schemes. The protocol is based on probabilistic polling. During each transaction, with some small probability, the vendor forwards information about this transaction to the bank. This enables the bank to maintain an accurate approximation of a customer’s spending. The frequency of polling messages is related to the monetary value of transactions and the amount of overspending the bank is willing to risk. For transactions of high monetary value, the cost of polling approaches that of the on-line schemes, but for micropayments, the cost of polling is a small increase over the traffic incurred by the off-line schemes.

[0077] Micropayments are often preferred where the amount of the transaction does not justify the costs of complete financial security. In the micropayment scheme, typically a direct communication between creditor and debtor is not required; rather, the transaction produces a result which eventually results in an economic transfer, but which may remain outstanding subsequent to transfer of the underlying goods or services. The theory underlying this micropayment scheme is that the monetary units are small enough such that risks of failure in transaction closure is relatively insignificant for both parties, but that a user gets few chances to default before credit is withdrawn. On the other hand, the transaction costs of a non-real time transactions of small monetary units are substantially less than those of secure, unlimited or potentially high value, real time verified transactions, allowing and facilitating such types of commerce. Thus, the rights management system may employ applets local to the client system, which communicate with other applets and/or the server and/or a vendor/rights-holder to validate a transaction, at low transactional costs.

[0078] The following U.S. patents, expressly incorporated herein by reference, define aspects of micropayment, digital certificate, and on-line payment systems: U.S. Pat. No. 5,930,777 (Barber, Jul. 27, 1999, Method of charging for pay-per-access information over a network); U.S. Pat. No. 5,857,023 (Jan. 5, 1999, Derners et al., Space efficient method of redeeming electronic payments); U.S. Pat. No. 5,815,657 (Sep. 29, 1998, Williams, System, method and article of manufacture for network electronic authorization utilizing an authorization instrument); U.S. Pat. No. 5,793,868 (Aug. 11, 1998, Micali, Certificate revocation system); U.S. Pat. No. 5,717,757 (Feb. 10, 1998, Micali, Certificate issue lists); U.S. Pat. No. 5,666,416 (Sep. 9, 1997, Micali, Certificate revocation system); U.S. Pat. No. 5,677,955 (Doggett et al., Electronic funds transfer instruments); U.S. Pat. No. 5,839,119 (Nov. 17, 1998, Krsul; et al., Method of electronic payments that prevents double-spending); U.S. Pat. No. 5,915,093 (Berlin et al.); U.S. Pat. No. 5,937,394 (Wong, et al.); U.S. Pat. No. 5,933,498 (Schneck et al.); U.S. Pat. No. 5,903,880 (Biffar); U.S. Pat. No. 5,903,651 (Kocher); U.S. Pat. No. 5,884,277 (Khosla); U.S. Pat. No. 5,960,083 (Sep. 28, 1999, Micali, Certificate revocation system); U.S. Pat. No. 5,963,924 (Oct. 5, 1999, Williams et al., System, method and article of manufacture for the use of payment instrument holders and payment instruments in network electronic commerce); U.S. Pat. No. 5,996,076 (Rowney et al., System, method and article of manufacture for secure digital certification of electronic commerce); U.S. Pat. No. 6,016,484 (Jan. 18, 2000, Williams et al., System, method and article of manufacture for network electronic payment instrument and certification of payment and credit collection utilizing a payment); U.S. Pat. No. 6,018,724 (Arent); U.S. Pat. No. 6,021,202 (Anderson et al., Method and system for processing electronic documents); U.S. Pat. No. 6,035,402 (Vaeth et al.); U.S. Pat. No. 6,049,786 (Smorodinsky); U.S. Pat. No. 6,049,787 (Takahashi, et al.); U.S. Pat. No. 6,058,381 (Nelson, Many-to-many payments system for network content materials); U.S. Pat. No. 6,061,448 (Smith, et al.); U.S. Pat. No. 5,987,132 (Nov. 16, 1999, Rowney, System, method and article of manufacture for conditionally accepting a payment method utilizing an extensible, flexible architecture); U.S. Pat. No. 6,057,872 (Candelore); and U.S. Pat. No. 6,061,665 (May 9, 2000, Bahreman, System, method and article of manufacture for dynamic negotiation of a network payment framework). See also, Rivest and Shamir, "PayWord and MicroMint: Two Simple Micropayment Schemes" (May 7, 1996); Micro PAYMENT transfer Protocol (MPTP) Version 0.1 (22 Nov. 95) et seq., <http://www.w3.org/pub/WWW/TR/WD-mptp>; Common Markup for web Micropayment Systems, <http://www.w3.org/TR/WD-Micropayment-Markup> (9 Jun. 99); "Distributing Intellectual Property: a Model of Microtransaction Based Upon Metadata and Digital Signatures", Olivia, Maurizio, <http://olivia.modlang.denison.edu/~olivia/RFC/09/>, all of which are expressly incorporated herein by reference.

[0079] See, also: U.S. Pat. No. 4,977,595 (Dec. 11, 1990, Method and apparatus for implementing electronic cash); U.S. Pat. No. 5,224,162 (Jun. 29, 1993, Electronic cash system); U.S. Pat. No. 5,237,159 (Aug. 17, 1993, Electronic check presentment system); U.S. Pat. No. 5,392,353 (February 1995, Morales, TV Answer, Inc. Interactive satellite broadcast network); U.S. Pat. No. 5,511,121 (Apr. 23, 1996, Efficient electronic money); U.S. Pat. No. 5,621,201 (April 1997, Langhans et al., Visa International Automated purchasing control system); U.S. Pat. No. 5,623,547 (Apr. 22, 1997,

Value transfer system); U.S. Pat. No. 5,679,940 (October 1997, Templeton et al., TeleCheck International, Inc. Transaction system with on/off line risk assessment); U.S. Pat. No. 5,696,908 (December 1997, Muehlberger et al., Southeast Phonecard, Inc. Telephone debit card dispenser and method); U.S. Pat. No. 5,754,939 (May 1998, Herz et al., System for generation of user profiles for a system for customized electronic identification of desirable objects); U.S. Pat. No. 5,768,385 (Jun. 16, 1998, Untraceable electronic cash); U.S. Pat. No. 5,799,087 (Aug. 25, 1998, Electronic-monetary system); U.S. Pat. No. 5,812,668 (Sep. 22, 1998, System, method and article of manufacture for verifying the operation of a remote transaction clearance system utilizing a multichannel, extensible, flexible architecture); U.S. Pat. No. 5,828,840 (Oct. 27, 1998, Server for starting client application on client if client is network terminal and initiating client application on server if client is non network terminal); U.S. Pat. No. 5,832,089 (Nov. 3, 1998, Off-line compatible electronic cash method and system); U.S. Pat. No. 5,850,446 (Dec. 15, 1998, System, method and article of manufacture for virtual point of sale processing utilizing an extensible, flexible architecture); U.S. Pat. No. 5,889,862 (Mar. 30, 1999, Method and apparatus for implementing traceable electronic cash); U.S. Pat. No. 5,889,863 (Mar. 30, 1999, System, method and article of manufacture for remote virtual point of sale processing utilizing a multichannel, extensible, flexible architecture); U.S. Pat. No. 5,898,154 (Apr. 27, 1999, System and method for updating security information in a time-based electronic monetary system); U.S. Pat. No. 5,901,229 (May 4, 1999, Electronic cash implementing method using a trustee); U.S. Pat. No. 5,920,629 (Jul. 6, 1999, Electronic-monetary system); U.S. Pat. No. 5,926,548 (Jul. 20, 1999, Method and apparatus for implementing hierarchical electronic cash); U.S. Pat. No. 5,943,424 (Aug. 24, 1999, System, method and article of manufacture for processing a plurality of transactions from a single initiation point on a multichannel, extensible, flexible architecture); U.S. Pat. No. 5,949,045 (Sep. 7, 1999, Micro-dynamic simulation of electronic cash transactions); U.S. Pat. No. 5,952,638 (Sep. 14, 1999, Space efficient method of electronic payments); U.S. Pat. No. 5,963,648 (Oct. 5, 1999, Electronic-monetary system); U.S. Pat. No. 5,978,840 (System, method and article of manufacture for a payment gateway system architecture for processing encrypted payment transactions utilizing a multichannel, extensible, flexible architecture); U.S. Pat. No. 5,983,208 (Nov. 9, 1999, System, method and article of manufacture for handling transaction results in a gateway payment architecture utilizing a multichannel, extensible, flexible architecture); U.S. Pat. No. 5,987,140 (Nov. 16, 1999, System, method and article of manufacture for secure network electronic payment and credit collection); U.S. Pat. No. 6,002,767 (Dec. 14, 1999, System, method and article of manufacture for a modular gateway server architecture); U.S. Pat. No. 6,003,765 (Dec. 21, 1999, Electronic cash implementing method with a surveillance institution, and user apparatus and surveillance institution apparatus for implementing the same); U.S. Pat. No. 6,021,399 (Feb. 1, 2000, Space efficient method of verifying electronic payments); U.S. Pat. No. 6,026,379 (Feb. 15, 2000, System, method and article of manufacture for managing transactions in a high availability system); U.S. Pat. No. 6,029,150 (Feb. 22, 2000, Payment and transactions in electronic commerce system); U.S. Pat. No. 6,029,151 (Feb. 22, 2000, Method and system for performing electronic money transactions); U.S. Pat. No. 6,047,067 (Apr. 4, 2000, Elec-

tronic-monetary system); U.S. Pat. No. 6,047,887 (Apr. 11, 2000, System and method for connecting money modules); U.S. Pat. No. 6,055,508 (Apr. 25, 2000, Method for secure accounting and auditing on a communications network); U.S. Pat. No. 6,065,675 (May 23, 2000, Processing system and method for a heterogeneous electronic cash environment); U.S. Pat. No. 6,072,870 (Jun. 6, 2000, System, method and article of manufacture for a gateway payment architecture utilizing a multichannel, extensible, flexible architecture), each of which is expressly incorporated herein by reference.

[0080] Neural Networks

[0081] The resources relating to Neural Networks, listed in the Neural Networks References Appendix, each of which is expressly incorporated herein by reference, provides a sound basis for understanding the field of neural networks (and the subset called artificial neural networks, which distinguish biological systems) and how these might be used to solve problems. A review of these references will provide a state of knowledge appropriate for an understanding of aspects of the invention which rely on Neural Networks, and to avoid a prolix discussion of no benefit to those already possessing an appropriate state of knowledge.

[0082] Wavelets

[0083] The following resources listed in the Wavelets References Appendix relate to Wavelets and wavelet based analysis, each of which is expressly incorporated herein by reference, provides a sound basis for understanding the mathematical basis for wavelet theory and analysis using wavelet transforms and decomposition, and how these might be used to solve problems or extract useful information from a signal. A review of these references will assure a background in this field for an understanding of aspects of the invention which rely on wavelet theory.

[0084] Telematics

[0085] The resources relating to telematics listed in the Telematics Appendix, each of which is expressly incorporated herein by reference, provides a background in the theory and practice of telematics, as well as some of the underlying technologies. A review of these references is therefore useful in understanding practical issues and the context of functions and technologies which may be used in conjunction with the advances set forth herein.

[0086] Game Theory

[0087] The following resources listed in the Game Theory References Appendix, relating to Game Theory, each of which is expressly incorporated herein by reference, provides a basis for understanding Game Theory and its implications for the design, control, and analysis of systems and networks. A review of these references will assure a background in this field for an understanding of aspects of the invention which relate to game Theory.

[0088] Use of Game Theory to Control Ad Hoc Networks

[0089] The resources relating to ad hoc networks and game theory listed in the Game Theory and Ad Hoc Networks References Appendix, each of which is expressly incorporated herein by reference, provides a sound basis for understanding the implications of game theory for the design, control and analysis of communications networks, and in particular, ad hoc networks. A review of these references will assure a background in this field for an understanding of aspects of the invention which rely on these topics.

[0090] The following patents are expressly incorporated herein by reference: U.S. Pat. Nos. 6,640,145, 6,418,424,

6,400,996, 6,081,750, 5,920,477, 5,903,454, 5,901,246, 5,875,108, 5,867,386, 5,774,357, 6,429,812, and 6,252,544.

BRIEF DESCRIPTION OF THE DRAWINGS

[0091] The drawings show:

[0092] FIG. 1 shows a Bayesian Network;

[0093] FIG. 2 shows a Markov chain;

[0094] FIG. 3 shows a model of the output of a Markov chain as a mixture of Gaussians;

[0095] FIGS. 4A-4C show an input-output, a factorial, and a coupled Hidden Markov Model (HMM), respectively;

[0096] FIG. 5 shows a predictor corrector algorithm of the discrete Kalman filter cycle;

[0097] FIG. 6 shows aspects of the discrete Kalman filter cycle algorithm;

[0098] FIG. 7 shows aspects of the extended Kalman filter cycle;

[0099] FIG. 8 shows a block diagram of a preferred embodiment of a communications system according to the present invention;

[0100] FIG. 9 is a schematic diagram showing the prioritization scheme; and

[0101] FIG. 10 is a block diagram representing a message format.

[0102] This patent builds upon and extends aspects of U.S. Pat. No. 6,252,544 (Hoffberg), Jun. 26, 2001, and U.S. Pat. No. 6,429,812, Aug. 6, 2002, which are expressly incorporated herein by reference in its entirety. See, also, U.S. Pat. No. 6,397,141 (Binnig, May 28, 2002, Method and device for signalling local traffic delays), expressly incorporated herein by reference, which relates to a method and an apparatus for signalling local traffic disturbances wherein a decentralised communication between vehicles, which is performed by exchanging their respective vehicle data. Through repeated evaluation of these individual vehicle data, each reference vehicle may determine a group of vehicles having relevance for itself from within a maximum group of vehicles and compare the group behavior of the relevant group with its own behavior. The results of this comparison are indicated in the reference vehicle, whereby a homogeneous flow of traffic may be generated, and the occurrence of accidents is reduced. See, also U.S. Pat. Nos. 4,706,086 (November, 1987 Panizza 340/902), and 5,428,544 (June, 1995 Shyu 701/117), 6,473,688 (Kohn, et al., Oct. 29, 2002, Traffic information transmitting system, traffic information collecting and distributing system and traffic information collecting and distributing method), 6,304,758 (October, 2001, Iierbig et al., 701/117); 6,411,221 (January, 2002, Horber, 701/117); 6,384,739 (May, 2002, Robert, Jr., 701/117); 6,401,027 (June, 2002, Xa et al., 701/117); 6,411,889 (June, 2002, Mizunuma et al., 701/117), 6,359,571 (Endo, et al., Mar. 19, 2002, Broadcasting type information providing system and travel environment information collecting device); 6,338,011 (Furst, et al., Jan. 8, 2002, Method and apparatus for sharing vehicle telemetry data among a plurality of users over a communications network); 5,131,020 (July, 1992, Liebesny et al., 455/422); 5,164,904 (November, 1992, Sumner, 701/117); 5,539,645 (July, 1996, Mandhyan et al., 701/119); 5,594,779 (January, 1997, Goodman, 455/4); 5,689,252 (November, 1997, Ayanoglu et al., 340/991); 5,699,056 (December, 1997, Yoshida, 340/905); 5,864,305 (January, 1999, Rosenquist, 340/905); 5,889,473 (March, 1999, Wicks, 340/825); 5,919,246 (July, 1999, Waizmann et al., 701/209); 5,982,298 (November, 1999, Lappenbusch et al., 340/905); 4,860,216 (Au-

gust, 1989, Linsenmayer, 342/159); 5,302,955 (April, 1994, Schutte et al., 342/59); 5,809,437 (September, 1998, Breed, 701/29); 6,115,654 (September, 2000, Eid et al., 701/34); 6,173,159 (January, 2001, Wright et al., 455/66); and Japanese Patent Document Nos. JP 9-236650 (September, 1997); 10-84430 (March, 1998); 5-151496 (June, 1993); and 11-183184 (July, 1999), each of which is expressly incorporated herein by reference. See also: Martin E. Liggins, II, et al., "Distributed Fusion Architectures and Algorithms for Target Tracking", Proceedings of the IEEE, vol. 85, No. 1, (XP-002166088) January, 1997, pp. 95-106.; D. M. Hosmer, "Data-Linked Associate Systems", 1994 IEEE International Conference on Systems, Man, and Cybernetics. Humans, Information and Technology (Cat. No. 94CH3571-5), Proceedings of IEEE International Conference on Systems, Man and Cybernetics, San Antonio, Tex., vol. 3, (XP-002166089) (1994), pp. 2075-2079.

[0103] One aspect of the invention provides a communications system, method and infrastructure. According to one preferred embodiment, an ad hoc, self organizing, cellular radio system (sometimes known as a "mesh network") is provided. Advantageously, high gain antennas are employed, preferably electronically steerable antennas, to provide efficient communications and to increase communications bandwidth, both between nodes and for the system comprising a plurality of nodes communicating with each other. See, U.S. Pat. No. 6,507,739 (Gross, et al., Jan. 14, 2003), expressly incorporated herein by reference.

[0104] In general, time-critical, e.g., voice communications require tight routing to control communications latency. On the other hand, non-time critical communications generally are afforded more leeway in terms of communications pathways, including a number of "hops", retransmission latency, and out-of-order packet communication tolerance, between the source and destination or fixed infrastructure, and quality of communication pathway. Further, it is possible to establish redundant pathways, especially where communications bandwidth is available, multiple paths possible, and no single available path meets the entire communications requirements or preferences.

[0105] Technologies for determining a position of a mobile device are also well known. Most popular are radio triangulation techniques, including artificial satellite and terrestrial transmitters or receivers, dead reckoning and inertial techniques. Advantageously, a satellite-based or augmented satellite system, although other suitable geolocation systems are applicable.

[0106] Navigation systems are also well known. These systems generally combine a position sensing technology with a geographic information system (GIS), e.g., a mapping database, to assist navigation functions. Systems which integrate GPS, GLONASS, LORAN or other positioning systems into vehicular guidance systems are well known, and indeed navigational purposes were prime motivators for the creation of these systems.

[0107] Environmental sensors are well known. For example, sensing technologies for temperature, weather, object proximity, location and identification, vehicular traffic and the like are well developed. In particular, known systems for analyzing vehicular traffic patterns include both stationary and mobile sensors, and networks thereof. Most often, such networks provide a stationary or centralized system for analyzing traffic information, which is then broadcast to vehicles.

[0108] Encryption technologies are well known and highly developed. These are generally classified as being symmetric key, for example the Data Encryption Standard (DES), and the more recent Advanced Encryption Standard (AES), in which the same key is used for encryption as decryption, and asymmetric key cryptography, in which different and complementary keys are used to encrypt and decrypt, in which the former and the latter are not derivable from each other (or one from the other) and therefore can be used for authentication and digital signatures. The use of asymmetric keys allows a so-called public key infrastructure, in which one of the keys is published, to allow communications to be directed to a possessor of a complementary key, and/or the identity of the sender of a message to be verified. Typical asymmetric encryption systems include the Rivest-Shamir-Adelman algorithm (RSA), the Diffie-Hellman algorithm (DH), elliptic curve encryption algorithms, and the so-called Pretty Good Privacy (PGP) algorithm.

[0109] One embodiment of the invention provides a system that analyzes both a risk and an associated reliability. Another embodiment of the invention communicates the risk and associated reliability in a manner for efficient human comprehension, especially in a distracting environment. See, U.S. Pat. Nos. 6,201,493; 5,977,884; 6,118,403; 5,982,325; 5,485,161; WO0077539, each of which is expressly incorporated herein by reference, and the Uniden GPSRD (see Uniden GPSRD User's Manual, expressly incorporated herein by reference). See, also U.S. Pat. Nos. 5,650,770; 5,450,329; 5,504,482; 5,504,491; 5,539,645; 5,929,753; 5,983,161; 6,084,510; 6,255,942; 6,225,901; 5,959,529; 5,752,976; 5,748,103; 5,720,770; 6,005,517; 5,805,055; 6,147,598; 5,687,215; 5,838,237; 6,044,257; 6,144,336; 6,285,867; 6,340,928; 6,356,822; 6,353,679 each of which is expressly incorporated herein by reference.

[0110] Statistical Analysis

[0111] It is understood that the below analysis and analytical tools, as well as those known in the art, may be used individually, in sub-combination, or in appropriate combination, to achieve the goals of the invention. These techniques may be implemented in dedicated or reprogrammable/general purpose hardware, and may be employed for low level processing of signals, such as in digital signal processors, within an operating system or dynamic linked libraries, or within application software. Likewise, these techniques may be applicable, for example, to low level data processing, system-level data processing, or user interface data processing.

[0112] A risk and reliability communication system may be useful, for example, to allow a user to evaluate a set of events in statistical context. Most indicators present data by means of a logical indicator or magnitude, as a single value. Scientific displays may provide a two-dimensional display of a distribution, but these typically require significant user focus to comprehend, especially where a multimodal distribution is represented. User displays of a magnitude or binary value typically do not provide any information about a likelihood of error. Thus, while a recent positive warning of the existence of an event may be a reliable indicator of the actual existence of the event, the failure to warn of an event does not necessarily mean that the event does not exist. Further, as events age, their reliability often decreases.

[0113] A Bayesian network is a representation of the probabilistic relationships among distinctions about the world. Each distinction, sometimes called a variable, can take on one

of a mutually exclusive and exhaustive set of possible states. Associated with each variable in a Bayesian network is a set of probability distributions. Using conditional probability notation, the set of probability distributions for a variable can be denoted by $p(x_i|\pi_i, \chi)$, where “p” refers to the probability distribution, where “ π_i ” denotes the parents of variable X_i and where “ χ ” denotes the knowledge of the expert. The Greek letter “ χ ” indicates that the Bayesian network reflects the knowledge of an expert in a given field. Thus, this expression reads as follows: the probability distribution for variable X_i given the parents of X_i and the knowledge of the expert. For example, X_1 is the parent of X_2 . The probability distributions specify the strength of the relationships between variables. For instance, if X_1 has two states (true and false), then associated with X_1 is a single probability distribution $p(x_1|\chi)p$ and associated with X_2 are two probability distributions $p(x_2|X_1=t, \chi)$ and $p(x_2|X_1=f, \chi)$.

[0114] A Bayesian network is expressed as an acyclic-directed graph where the variables correspond to nodes and the relationships between the nodes correspond to arcs. The arcs in a Bayesian network convey dependence between nodes. When there is an arc between two nodes, the probability distribution of the first node depends upon the value of the second node when the direction of the arc points from the second node to the first node. Missing arcs in a Bayesian network convey conditional independencies. However, two variables indirectly connected through intermediate variables are conditionally dependent given lack of knowledge of the values (“states”) of the intermediate variables. In other words, sets of variables X and Y are said to be conditionally independent, given a set of variables Z , if the probability distribution for X given Z does not depend on Y . If Z is empty, however, X and Y are said to be “independent” as opposed to conditionally independent. If X and Y are not conditionally independent, given Z , then X and Y are said to be conditionally dependent given Z .

[0115] The variables used for each node may be of different types. Specifically, variables may be of two types: discrete or continuous. A discrete variable is a variable that has a finite or countable number of states, whereas a continuous variable is a variable that has an effectively infinite number of states. An example of a discrete variable is a Boolean variable. Such a variable can assume only one of two states: “true” or “false.” An example of a continuous variable is a variable that may assume any real value between -1 and 1 . Discrete variables have an associated probability distribution. Continuous variables, however, have an associated probability density function (“density”). Where an event is a set of possible outcomes, the density $p(x)$ for a variable “ x ” and events “ a ” and “ b ” is defined as:

$$p(x) = \lim_{a \rightarrow b} \left[\frac{p(a \leq x \leq b)}{|(a - b)|} \right]$$

[0116] where $p(a \leq x \leq b)$ is the probability that x lies between a and b . Conventional systems for generating Bayesian networks cannot use continuous variables in their nodes.

[0117] There are two conventional approaches for constructing Bayesian networks. Using the first approach (“the knowledge-based approach”), first the distinctions of the world that are important for decision making are determined. These distinctions correspond to the variables of the domain of the Bayesian network. The “domain” of a Bayesian net-

work is the set of all variables in the Bayesian network. Next the dependencies among the variables (the arcs) and the probability distributions that quantify the strengths of the dependencies are determined.

[0118] In the second approach (“called the data-based approach”), the variables of the domain are first determined. Next, data is accumulated for those variables, and an algorithm is applied that creates a Bayesian network from this data. The accumulated data comes from real world instances of the domain. That is, real world instances of decision making in a given field. Conventionally, this second approach exists for domains containing only discrete variables.

[0119] U.S. application Ser. No. 08/240,019 filed May 9, 1994 entitled “Generating Improved Belief Networks” describes a system and method for generating Bayesian networks (also known as “belief networks”) that utilize both expert data received from an expert (“expert knowledge”) and data received from real world instances of decisions made (“empirical data”). By utilizing both expert knowledge and empirical data, the network generator provides an improved Bayesian network that may be more accurate than conventional Bayesian networks or provide other advantages, e.g., ease of implementation and lower reliance on “expert” estimations of probabilities. Likewise, it is known to initiate a network using estimations of the probabilities (and often the relevant variables), and subsequently use accumulated data to refine the network to increase its accuracy and precision.

[0120] Expert knowledge consists of two components: an equivalent sample size or sizes (“sample size”), and the prior probabilities of all possible Bayesian-network structures (“priors on structures”). The effective sample size is the effective number of times that the expert has rendered a specific decision. For example, a doctor with 20 years of experience diagnosing a specific illness may have an effective sample size in the hundreds. The priors on structures refers to the confidence of the expert that there is a relationship between variables (e.g., the expert is 70% sure that two variables are related). The priors on structures can be decomposed for each variable-parent pair known as the “prior probability” of the variable-parent pair. Empirical data is typically stored in a database. The database may contain a list of the observed state of some or all of the variables in the Bayesian network. Each data entry constitutes a case. When one or more variables are unobserved in a case, the case containing the unobserved variable is said to have “missing data.” Thus, missing data refers to when there are cases in the empirical data database that contain no observed value for one or more of the variables in the domain. An assignment of one state to each variable in a set of variables is called an “instance” of that set of variables. Thus, a “case” is an instance of the domain. The “database” is the collection of all cases.

[0121] Therefore, it is seen that Bayesian networks can be used to probabilistically model a problem, in a mathematical form. This model may then be analyzed to produce one or more outputs representative of the probability that a given fact is true, or a probability density distribution that a variable is at a certain value.

[0122] A review of certain statistical methods is provided below for the convenience of the reader, and is not intended to limit the scope of methods, of statistical or other type, which may be employed in conjunction with the system and method according to the present invention. It is understood that these mathematical models and methods may be implemented in known manner on general purpose computing platforms, for

example as a compiled application in a real-time operating system such as RT Linux, QNX, versions of Microsoft Windows, or the like. Further, these techniques may be implemented as applets operating under Matlab or other scientific computing platform. Alternately, the functions may be implemented natively in an embedded control system or on a microcontroller.

[0123] It is also understood that, while the mathematical methods are capable of producing precise and accurate results, various simplifying presumptions and truncations may be employed to increase the tractability of the problem to be solved. Further, the outputs generally provided according to preferred embodiments of the present invention are relatively low precision, and therefore higher order approximation of the analytic solution, in the case of a rapidly convergent calculation, will often be sufficient.

[0124] A time domain process demonstrates a Markov property if the conditional probability density of the current event, given all present and past events, depends only on the j th most recent events. If the current event depends solely on the most recent past event, then the process is a first order Markov process. There are three key problems in HMM use: evaluation, estimation, and decoding. The evaluation problem is that given an observation sequence and a model, what is the probability that the observed sequence was generated by the model ($\Pr(O|\lambda)$). If this can be evaluated for all competing models for an observation sequence, then the model with the highest probability can be chosen for recognition.

[0125] $\Pr(O|\lambda)$ can be calculated several ways. The naive way is to sum the probability over all the possible state sequences in a model for the observation sequence:

$$\Pr(O|\lambda) = \sum_{\textcircled{?}} \prod_{\textcircled{?}}^T a_{\textcircled{?}} b_{\textcircled{?}}(O_{\textcircled{?}})$$

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[0126] However, this method is exponential in time, so the more efficient forward-backward algorithm is used in practice. The following algorithm defines the forward variable α and uses it to generate $\Pr(O|\lambda)$ (π are the initial state probabilities, a are the state transition probabilities, and b are the output probabilities).

[0127] $\alpha_1(i) = \pi_i b_i(O_1)$, for all states i (if

$$i \in S_1, \pi_i = \frac{L}{\textcircled{?}};$$

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otherwise $\pi_i = 0$)

[0128] Calculating $\alpha(\cdot)$ along the time axis, for $t=2, \dots, T$, and all states j , compute

$$a_{\textcircled{?}}(j) = \left[\sum_i a_{\textcircled{?}}(i) \textcircled{?}_{ij} \right] b_j(O_{\textcircled{?}})$$

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[0129] Final probability is given by

$$\Pr(O|\lambda) = \sum_{\textcircled{?}} \textcircled{?}_p T(i)$$

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[0130] The first step initializes the forward variable with the initial probability for all states, while the second step inductively steps the forward variable through time. The final step gives the desired result $\Pr(O|\lambda)$, and it can be shown by constructing a lattice of states and transitions through time that the computation is only order $O(N^2T)$. The backward algorithm, using a process similar to the above, can also be used to compute $\Pr(O|\lambda)$ and defines the convenience variable β .

[0131] The estimation problem concerns how to adjust λ to maximize $\Pr(O|\lambda)$ given an observation sequence O . Given an initial model, which can have flat probabilities, the forward-backward algorithm allows us to evaluate this probability. All that remains is to find a method to improve the initial model. Unfortunately, an analytical solution is not known, but an iterative technique can be employed.

[0132] Using the actual evidence from the training data, a new estimate for the respective output probability can be assigned:

$$\bar{b}_j(k) = \frac{\sum_{\textcircled{?}} \gamma_{\textcircled{?}}(j)}{\sum_{\textcircled{?}} \gamma_{\textcircled{?}}(j)}$$

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[0133] where $\gamma_t(i)$ is defined as the posterior probability of being in state i at time t given the observation sequence and the model. Similarly, the evidence can be used to develop a new estimate of the probability of a state transition (a_{ij}) and initial state probabilities (π_i).

[0134] Thus all the components of model (λ) can be re-estimated. Since either the forward or backward algorithm can be used to evaluate $\Pr(O|\lambda)$ versus the previous estimation, the above technique can be used iteratively to converge the model to some limit. While the technique described only handles a single observation sequence, it is easy to extend to a set of observation sequences.

[0135] The Hidden Markov Model is a finite set of states, each of which is associated with a (generally multidimensional) probability distribution <http://jedlik.phy.bme.hu/~gerjanos/HMM/node4.html>—r4#r4. Transitions among the states are governed by a set of probabilities called transition probabilities. In a particular state an outcome or observation can be generated, according to the associated probability distribution. It is only the outcome, not the state visible to an external observer and therefore states are “hidden” to the outside; hence the name Hidden Markov Model.

[0136] In order to define an HMM completely, following elements are needed.

[0137] The number of states of the model, N .

[0138] The number of observation symbols in the alphabet, M . If the observations are continuous then M is infinite.

[0139] A set of state transition probabilities $A = \{a_{ij}\}$ $a_{ij} = p\{q_{t+1}=j|q_t=i\}$, $2 \leq i, j \leq N$,

[0140] where q_t denotes the current state.

Transition probabilities should satisfy the normal stochastic constraints,

$$a_{ij} \geq 0, \quad 1 \leq i, j \leq N$$

and

$$\sum_{j=1}^N a_{ij} = 1, \quad 1 \leq i \leq N$$

$$B = \{b_j(k)\}$$

[0141] A probability distribution in each of the states,

$$b_j(k) = p\{o_t = v_k | q_t = j\}, \quad 1 \leq j \leq N, \quad 1 \leq k \leq M$$

where v_k denotes the k^{th} observation symbol in the alphabet, and o_t the current parameter vector. Following stochastic constraints must be satisfied.

$$b_j(k) \geq 0, \quad 1 \leq j \leq N, \quad 1 \leq k \leq M$$

and

$$\sum_{k=1}^M b_j(k) = 1, \quad 1 \leq j \leq N$$

[0142] If the observations are continuous then we will have to use a continuous probability density function, instead of a set of discrete probabilities. In this case we specify the parameters of the probability density function. Usually the probability density is approximated by a weighted sum of M Gaussian distributions $\mathcal{N}$,

$$b_j(o_t) = \sum_{m=1}^M c_{jm} \mathcal{N}(\mu_{jm}, \Sigma_{jm}, o_t)$$

[0143] where,

[0144] c_{jm} = weighting coefficients

[0145] μ_{jm} = mean vectors

[0146] Σ_{jm} = Covariance matrices

[0147] c_{jm} should satisfy the stochastic constraints,

$$c_{jm} \geq 0, \quad 1 \leq j \leq N, \quad 1 \leq m \leq M$$

and

$$\sum_{m=1}^M c_{jm} = 1, \quad 1 \leq j \leq N$$

$$\pi = \{\pi_i\}$$

[0148] The initial state distribution,

$$\text{where, } \pi_i = p\{q_1 = i\}, \quad 1 \leq i \leq N$$

[0149] Therefore we can use the compact notation $\lambda = (\Lambda, B, \pi)$

[0150] to denote an HMM with discrete probability distributions, while $\lambda = (\Lambda, c_{jm}, \mu_{jm}, \Sigma_{jm}, \pi)$

[0151] to denote one with continuous densities.

[0152] For the sake of mathematical and computational tractability, following assumptions are made in the theory of HMMs.

[0153] (1) The Markov assumption

[0154] As given in the definition of HMMs, transition probabilities are defined as,

$$a_{ij} = p\{q_{t+1} = j | q_t = i\}.$$

[0155] In other words it is assumed that the next state is dependent only upon the current state. This is called the Markov assumption and the resulting model becomes actually a first order HMM.

[0156] However generally the next state may depend on past k states and it is possible to obtain a such model, called an k^{th} order HMM by defining the transition probabilities as follows.

$$a_{i_1 i_2 \dots i_k j} = p\{q_{t+1} = j | q_t = i_1, q_{t-1} = i_2, \dots, q_{t-k+1} = i_k\}, \\ 1 \leq i_1, i_2, \dots, i_k, j \leq N.$$

[0157] But it is seen that a higher order HMM will have a higher complexity. Even though the first order HMMs are the most common, some attempts have been made to use the higher order HMMs too.

[0158] (2) The Stationarity Assumption

[0159] Here it is assumed that state transition probabilities are independent of the actual time at which the transitions takes place. Mathematically, $p\{q_{t+1} = j | q_t = i\} = p\{q_{t_2+1} = j | q_{t_2} = i\}$,

[0160] for any t_1 and t_2 .

[0161] (3) The output Independence Assumption

[0162] This is the assumption that current output (observation) is statistically independent of the previous outputs (observations). We can formulate this assumption mathematically, by considering a sequence of observations,

$$O = o_1, o_2, \dots, o_T.$$

[0163] Then according to the assumption for an HMM λ ,

$$p\{O | q_1, q_2, \dots, q_T, \lambda\} = \prod_{t=1}^T p(o_t | q_t, \lambda).$$

[0164] However unlike the other two, this assumption has a very limited validity. In some cases this assumption may not be fair enough and therefore becomes a severe weakness of the HMMs.

[0165] A Hidden Markov Model (HMM) is a Markov chain, where each state generates an observation. You only see the observations, and the goal is to infer the hidden state sequence. HMMs are very useful for time-series modeling, since the discrete state-space can be used to approximate many non-linear, non-Gaussian systems.

[0166] HMMs and some common variants (e.g., input-output HMMs) can be concisely explained using the language of Bayesian Networks, as we now demonstrate.

[0167] Consider the Bayesian network in FIG. 1, which represents a hidden Markov model (HMM). (Circles denote continuous-valued random variables, squares denote discrete-valued, clear means hidden, shaded means observed.) This encodes the joint distribution

$$P(Q, Y) = P(Q_1)P(Y_1 | Q_1)P(Q_2 | Q_1)P(Y_2 | Q_2)$$

[0168] For a sequence of length T, we simply “unroll” the model for T time steps. In general, such a dynamic Bayesian

network (DBN) can be specified by just drawing two time slices (this is sometimes called a 2TBN)—the structure (and parameters) are assumed to repeat.

[0169] The Markov property states that the future is independent of the past given the present, i.e., $Q_{(t+1)} \setminus \text{indep } Q_{(t-1)} | Q_t$. We can parameterize this Markov chain using a transition matrix, $M_{(ij)} = P(Q_{(t+1)} = j | Q_t = i)$, and a prior distribution, $\pi_i = P(Q_1 = i)$.

[0170] We have assumed that this is a homogeneous Markov chain, i.e., the parameters do not vary with time. This assumption can be made explicit by representing the parameters as nodes: see FIG. 2: P1 represents π , P2 represents the transition matrix, and P3 represents the parameters for the observation model. If we think of these parameters as random variables (as in the Bayesian approach), parameter estimation becomes equivalent to inference. If we think of the parameters as fixed, but unknown, quantities, parameter estimation requires a separate learning procedure (usually EM). In the latter case, we typically do not represent the parameters in the graph; shared parameters (as in this example) are implemented by specifying that the corresponding CPDs are “tied”.

[0171] An HMM is a hidden Markov model because we don't see the states of the Markov chain, Q_t , but just a function of them, namely Y_t . For example, if Y_t is a vector, we might define $P(Y_t = y | Q_t = i) = N(y; \mu_i, \sigma_i)$. A richer model, widely used in speech recognition, is to model the output (conditioned on the hidden state) as a mixture of Gaussians. This is shown in FIG. 3.

[0172] Some popular variations on the basic HMM theme are illustrated in FIGS. 4A, 4B and 4C, which represent, respectively, an input-output HMM, a factorial HMM, and a coupled HMM. (In the input-output model, the CPD $P(Q|U)$ could be a softmax function, or a neural network.) Software is available to handle inference and learning in general Bayesian networks, making all of these models trivial to implement.

[0173] It is noted that the parameters may also vary with time. This does not violate the presumptions inherent in an HMM, but rather merely complicates the analysis since a static simplifying presumption may not be made.

[0174] A discrete-time, discrete-space dynamical system governed by a Markov chain emits a sequence of observable outputs: one output (observation) for each state in a trajectory of such states. From the observable sequence of outputs, we may infer the most likely dynamical system. The result is a model for the underlying process. Alternatively, given a sequence of outputs, we can infer the most likely sequence of states. We might also use the model to predict the next observation or more generally a continuation of the sequence of observations.

[0175] The Evaluation Problem and the Forward Algorithm

[0176] We have a model $\lambda = (\Lambda, B, \pi)$ and a sequence of observations $O = o_1, o_2, \dots, o_T$, and $p\{O|\lambda\}$ must be found. We can calculate this quantity using simple probabilistic arguments. But this calculation involves number of operations in the order of N^T . This is very large even if the length of the sequence, T is moderate. Therefore we have to look for an other method for this calculation. Fortunately there exists one which has a considerably low complexity and makes use an auxiliary variable, $\alpha_t(i)$ called forward variable.

[0177] The forward variable is defined as the probability of the partial observation sequence $o_1, o_2, \dots, o_T$, when it terminates at the state i . Mathematically,

$$\alpha_t(i) = p\{o_1, o_2, \dots, o_T, q_t = i | \lambda\} \quad (1.1)$$

[0178] Then it is easy to see that following recursive relationship holds.

$$\alpha_{t+1}(j) = b_j(o_{t+1}) \sum_{i=1}^N \alpha_t(i) a_{ij}, \quad 1 \leq j \leq N, \quad 1 \leq t \leq T-1 \quad (1.2)$$

[0179] where, $\alpha_1(j) = \pi_j b_j(o_1)$, $1 \leq j \leq N$

[0180] Using this recursion we can calculate $\alpha_T(i)$, $1 \leq i \leq N$

[0181] and then the required probability is given by,

$$p\{O | \lambda\} = \sum_{i=1}^N \alpha_T(i) \quad (1.3)$$

[0182] The complexity of this method, known as the forward algorithm is proportional to N^2T , which is linear with respect to T whereas the direct calculation mentioned earlier, had an exponential complexity.

[0183] In a similar way we can define the backward variable $\beta_t(i)$ as the probability of the partial observation sequence $o_{t+1}, o_{t+2}, \dots, o_T$, given that the current state is i . Mathematically,

$$\beta_t(i) = p\{o_{t+1}, o_{t+2}, \dots, o_T | q_t = i, \lambda\} \quad (1.4)$$

[0184] As in the case of $\alpha_t(i)$ there is a recursive relationship which can be used to calculate $\beta_t(i)$ efficiently.

$$\beta_t(i) = \sum_{j=1}^N \beta_{t+1}(j) a_{ij} b_j(o_{t+1}), \quad 1 \leq i \leq N, \quad 1 \leq t \leq T-1 \quad (1.5)$$

[0185] where, $\beta_T(i) = 1$, $1 \leq i \leq N$

[0186] Further we can see that,

$$\alpha_t(i) \beta_t(i) = p\{O, q_t = i | \lambda\}, \quad 1 \leq i \leq N, \quad 1 \leq t \leq T \quad (1.6)$$

[0187] Therefore this gives another way to calculate $p\{O|\lambda\}$, by using both forward and backward variables as given in eqn. 1.7. See, <http://jedlik.phy.bme.hu/~gerjanos/HMM/>, expressly incorporated herein by reference.

$$p\{O | \lambda\} = \sum_{i=1}^N p\{O, q_t = i | \lambda\} = \sum_{i=1}^N \alpha_t(i) \beta_t(i) \quad (1.7)$$

[0188] Eqn. 1.7 is very useful, specially in deriving the formulas required for gradient based training.

[0189] The Decoding Problem and the Viterbi Algorithm

[0190] While the estimation and evaluation processes described above are sufficient for the development of an HMM system, the Viterbi algorithm provides a quick means of evaluating a set of HMM's in practice as well as providing a solution for the decoding problem. In decoding, the goal is to recover the state sequence given an observation sequence. The Viterbi algorithm can be viewed as a special form of the forward-backward algorithm where only the maximum path at each time step is taken instead of all paths. This optimization reduces computational load and allows the recovery of the most likely state sequence. The steps to the Viterbi are

[0191] Initialization. For all states i , $\delta_1(i) = \pi_i b_i(O_1)$; $\psi_1(i) = 0$

[0192] Recursion. From $t=2$ to T and for all states j , $\delta_t(j) = \max_i [\delta_{t-1}(i) a_{ij}] b_j(O_t)$; $\psi_t(j) = \arg \max_i [\delta_{t-1}(i) a_{ij}]$

[0193] Termination. $P = \max_{ms_p} [\delta_T(a)]$; $s_T = \arg \max_{ms_p} [\delta_T(s)]$

[0194] Recovering the state sequence. From $t=T-1$ to 1, $s_t = \psi_{t+1}(s_{t+1})$

[0195] In many HMM system implementations, the Viterbi algorithm is used for evaluation at recognition time. Note that since Viterbi only guarantees the maximum of $\Pr(O, S | \lambda)$ over all state sequences S (as a result of the first order Markov assumption) instead of the sum over all possible state sequences, the resultant scores are only an approximation.

[0196] So far the discussion has assumed some method of quantization of feature vectors into classes. However, instead of using vector quantization, the actual probability densities for the features may be used. Baum-Welch, Viterbi, and the forward-backward algorithms can be modified to handle a variety of characteristic densities. In this context, however, the densities will be assumed to be Gaussian. Specifically,

$$b_j(O_t) = \frac{1}{\sqrt{(2\pi)^d |\sigma_j|}} e^{-\frac{1}{2} (O_t - \mu_j)^T \sigma_j^{-1} (O_t - \mu_j)}$$

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[0197] Initial estimations of μ and σ may be calculated by dividing the evidence evenly among the states of the model and calculating the mean and variance in the normal way. Whereas flat densities were used for the initialization step before, the evidence is used here. Now all that is needed is a way to provide new estimates for the output probability. We wish to weight the influence of a particular observation for each state based on the likelihood of that observation occurring in that state. Adapting the solution from the discrete case yields

$$\bar{\mu}_j = \frac{\sum_{t=1}^T \gamma_t(j) O_t}{\sum_{t=1}^T \gamma_t(j)}$$

and

$$\bar{\sigma}_j = \frac{\sum_{t=1}^T \gamma_t(j) (O_t - \bar{\mu}_j)(O_t - \bar{\mu}_j)^T}{\sum_{t=1}^T \gamma_t(j)}$$

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[0198] For convenience, $\bar{\mu}_j$ is used to calculate μ_j instead of the re-estimated μ_j . While this is not strictly proper, the values are approximately equal in contiguous iterations and seem not to make an empirical difference. See, <http://www-white.media.mit.edu/~testarne/asl/asl-tr375>, expressly incorporated herein by reference. Since only one stream of data is being used and only one mixture (Gaussian density) is being

assumed, the algorithms above can proceed normally, incorporating these changes for the continuous density case.

[0199] We want to find the most likely state sequence for a given sequence of observations, $O = o_1, o_2, \dots, o_T$ and a model, $\lambda = (\Lambda, B, \pi)$.

[0200] The solution to this problem depends upon the way “most likely state sequence” is defined. One approach is to find the most likely state q_t at $t=t$ and to concatenate all such q_t 's. But sometimes, this method does not give a physically meaningful state sequence. Therefore we would seek another method which has no such problems.

In this method, commonly known as Viterbi algorithm, the whole state sequence with the maximum likelihood is found. In order to facilitate the computation we define an auxiliary variable,

$$\delta_t(i) = \max_{q_1, q_2, \dots, q_{t-1}} p\{q_1, q_2, \dots, q_{t-1}, q_t = i, o_1, o_2, \dots, o_{t-1} | \lambda\},$$

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[0201] which gives the highest probability that partial observation sequence and state sequence up to $t=t$ can have, when the current state is i .

It is easy to observe that the following recursive relationship holds.

$$\delta_{t+1}(j) = b_j(o_{t+1}) \left[\max_{1 \leq i \leq N} \delta_t(i) a_{ij} \right], \quad 1 \leq i \leq N, \quad 1 \leq t \leq T-1 \quad (1.8)$$

[0202] where, $\delta_1(j) = \pi_j b_j(o_1)$, $1 \leq j \leq N$

[0203] So the procedure to find the most likely state sequence starts from calculation of $\delta_T(j)$, $1 \leq j \leq N$ using recursion in 1.8, while always keeping a pointer to the “winning state” in the maximum finding operation. Finally the state j^* , is found where

$$j^* = \arg \max_{1 \leq j \leq N} \delta_T(j),$$

[0204] and starting from this state, the sequence of states is back-tracked as the pointer in each state indicates. This gives the required set of states.

[0205] This whole algorithm can be interpreted as a search in a graph whose nodes are formed by the states of the HMM in each of the time instant t , $1 \leq t \leq T$.

[0206] The Learning Problem

[0207] Generally, the learning problem is how to adjust the HMM parameters, so that the given set of observations (called the training set) is represented by the model in the best way for the intended application. Thus it would be clear that the “quantity” we wish to optimize during the learning process can be different from application to application. In other words there may be several optimization criteria for learning, out of which a suitable one is selected depending on the application.

[0208] There are two main optimization criteria found in ASR literature; Maximum Likelihood (ML) and Maximum Mutual Information (MMI). The solutions to the learning problem under each of those criteria is described below.

[0209] Maximum Likelihood (ML) Criterion

[0210] In ML we try to maximize the probability of a given sequence of observations O^W , belonging to a given class w , given the HMM λ_w of the class w , with respect to the parameters of the model λ_w . This probability is the total likelihood of the observations and can be expressed mathematically as

$$L_{tot} = p\{O^W | \lambda_w\}$$

[0211] However since we consider only one class w at a time we can drop the subscript and superscript 'w's. Then the ML criterion can be given as,

$$L_{tot} = p\{O | \lambda\} \quad (1.9)$$

[0212] However there is no known way to analytically solve for the model $\lambda = (\Lambda, B, \pi)$, which maximize the quantity L_{tot} . But we can choose model parameters such that it is locally maximized, using an iterative procedure, like Baum-Welch method or a gradient based method, which are described below.

[0213] Baum-Welch Algorithm

[0214] This method can be derived using simple "occurrence counting" arguments or using calculus to maximize the auxiliary quantity

$$Q(\lambda, \bar{\lambda}) = \sum_q p\{q | O, \lambda\} \log[p\{O, q, \bar{\lambda}\}]$$

[0215] over $\bar{\lambda}$ [http://jedlik.phy.bme.hu/~gerjanos/HMM/node11.html—r4#r4], [http://jedlik.phy.bme.hu/~gerjanos/HMM/node11.html—r21#r21, p 344-346]. A special feature of the algorithm is the guaranteed convergence.

To describe the Baum-Welch algorithm, (also known as Forward-Backward algorithm), we need to define two more auxiliary variables, in addition to the forward and backward variables defined in a previous section. These variables can however be expressed in terms of the forward and backward variables.

[0216] First one of those variables is defined as the probability of being in state i at $t=t$ and in state j at $t=t+1$. Formally,

$$\xi_t(i, j) = p\{q_t = i, q_{t+1} = j | O, \lambda\} \quad (1.10)$$

[0217] This is the same as,

$$\xi_t(i, j) = \frac{p\{q_t = i, q_{t+1} = j, O | \lambda\}}{p\{O | \lambda\}} \quad (1.11)$$

[0218] Using forward and backward variables this can be expressed as,

$$\xi_t(i, j) = \frac{\alpha_t(i) \alpha_{i,j} \beta_{t+1}(j) b_j(o_{t+1})}{\sum_{i=1}^N \sum_{j=1}^N \alpha_t(i) \alpha_{i,j} \beta_{t+1}(j) b_j(o_{t+1})} \quad (1.12)$$

[0219] The second variable is the a posteriori probability,

$$\gamma_t(i) = p\{q_t = i | O, \lambda\} \quad (1.13)$$

[0220] that is the probability of being in state i at $t=t$, given the observation sequence and the model. In forward and backward variables this can be expressed by,

$$\gamma_t(i) = \left[\frac{\alpha_t(i) \beta_t(i)}{\sum_{i=1}^N \alpha_t(i) \beta_t(i)} \right] \quad (1.14)$$

[0221] One can see that the relationship between $\gamma_t(i)$ and $\xi_t(i, j)$ is given by,

$$\gamma_t(i) = \sum_{j=1}^N \xi_t(i, j), \quad 1 \leq i \leq N, \quad 1 \leq t \leq M \quad (1.15)$$

[0222] Now it is possible to describe the Baum-Welch learning process, where parameters of the HMM is updated in such a way to maximize the quantity, $p\{O | \lambda\}$. Assuming a starting model $\lambda = (\Lambda, B, \pi)$, we calculate the ' α 's and ' β 's using the recursions 1.5 and 1.2, and then ' ξ 's and ' γ 's using 1.12 and 1.15. Next step is to update the HMM parameters according to eqns 1.16 to 1.18, known as re-estimation formulas.

$$\bar{\pi}_i = \gamma_1(i), \quad 1 \leq i \leq N \quad (1.16)$$

$$\bar{a}_{ij} = \frac{\sum_{t=1}^{T-1} \xi_t(i, j)}{\sum_{t=1}^{T-1} \gamma_t(i)}, \quad 1 \leq i \leq N, \quad 1 \leq j \leq N \quad (1.17)$$

$$\bar{b}_j(k) = \frac{\sum_{t=1}^T \gamma_t(j)}{\sum_{t=1}^T \gamma_t(j)}, \quad 1 \leq j \leq N, \quad 1 \leq k \leq M \quad (1.18)$$

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[0223] These reestimation formulas can easily be modified to deal with the continuous density case too.

[0224] Gradient Based Method

[0225] In the gradient based method, any parameter θ of the HMM λ is updated according to the standard formula,

$$\Theta^{new} = \Theta^{old} - \eta \left[\frac{\partial J}{\partial \Theta} \right]_{\Theta = \Theta^{old}} \quad (1.19)$$

[0226] where J is a quantity to be minimized. We define in this case,

$$J = E_{ML} = -\log(p\{O | \lambda\}) = -\log(L_{tot}) \quad (1.20)$$

[0227] Since the minimization of $J = E_{ML}$ is equivalent to the maximization of L_{tot} , eqn. 1.19 yields the required optimization criterion, ML. But the problem is to find the derivative

$$\frac{\partial J}{\partial \Theta}$$

for any parameter Θ of the model. This can be easily done by relating J to model parameters via L_{tot} . As a key step to do so, using the eqns. 1.7 and 1.9 we can obtain,

$$L_{tot} = \sum_{i=1}^N p\{O, q_t = i \mid \lambda\} = \sum_{i=1}^N \alpha_t(i) \beta_t(i) \quad (1.21)$$

[0228] Differentiating the last equality in eqn. 1.20 with respect to an arbitrary parameter Θ ,

$$\frac{\partial J}{\partial \Theta} = -\frac{1}{L_{tot}} \frac{\partial L_{tot}}{\partial \Theta} \quad (1.22)$$

[0229] Eqn. 1.22 gives

$$\frac{\partial J}{\partial \Theta},$$

if we know

$$\frac{\partial L_{tot}}{\partial \Theta}$$

which can be found using eqn. 1.21. However this derivative is specific to the actual parameter concerned. Since there are two main parameter sets in the HMM, namely transition probabilities α_{ij} , $1 \leq i, j \leq N$ and observation probabilities $b_j(k)$, $1 \leq j \leq N$, $1 \leq k \leq M$, we can find the derivative

$$\frac{\partial L_{tot}}{\partial \Theta}$$

for each of the parameter sets and hence the gradient,

$$\frac{\partial J}{\partial \Theta}.$$

[0230] Gradient with Respect to Transition Probabilities

[0231] Using the chain rule,

$$\frac{\partial L_{tot}}{\partial \alpha_{ij}} = \sum_{t=1}^T \frac{\partial L_{tot}}{\partial \alpha_t(j)} \frac{\partial \alpha_t(j)}{\partial \alpha_{ij}} \quad (1.23)$$

[0232] By differentiating eqn. 1.21 with respect to $\alpha_t(j)$ we get,

$$\frac{\partial L_{tot}}{\partial \alpha_t(j)} = \beta_t(j), \quad (1.24)$$

[0233] and differentiating (a time shifted version of) eqn 1.2 with respect to α_{ij}

$$\frac{\partial \alpha_t(j)}{\partial \alpha_{ij}} = b_j(o_t) \alpha_{t-1}(i) \quad (1.25)$$

[0234] Eqns. 1.23, 1.24 and 1.25 give,

$$\frac{\partial L_{tot}}{\partial \alpha_{ij}},$$

and substituting this quantity in eqn. 1.22 (keeping in mind that $\Theta = \alpha_{ij}$ in this case), we get the required result,

$$\frac{\partial J}{\partial \alpha_{ij}} = -\frac{1}{L_{tot}} \sum_{t=1}^T \beta_t(j) b_j(o_t) \alpha_{t-1}(i) \quad (1.26)$$

[0235] Gradient with Respect to Observation Probabilities

[0236] Using the chain rule,

$$\frac{\partial L_{tot}}{\partial b_j(o_t)} = \frac{\partial L_{tot}}{\partial \alpha_t(j)} \frac{\partial \alpha_t(j)}{\partial b_j(o_t)} \quad (1.27)$$

[0237] Differentiating (a time shifted version of) the eqn. 1.2 with respect to $b_j(o_t)$

$$\frac{\partial \alpha_t(j)}{\partial b_j(o_t)} = \frac{\alpha_t(j)}{b_j(o_t)} \quad (1.28)$$

[0238] Finally we get the required probability, by substituting for

$$\frac{\partial L_{tot}}{\partial b_j(o_t)}$$

in eqn. 1.22 (keeping in mind that $\Theta = b_j(o_t)$ in this case), which is obtained by substituting eqns. 1.28 and 1.24 in eqn. 1.27.

$$\frac{\partial J}{\partial b_j(o_t)} = -\frac{1}{L_{tot}} \frac{\alpha_t(j) \beta_t(j)}{b_j(o_t)}, \quad (1.29)$$

[0239] Usually this is given the following form, by first substituting for L_{tot} from eqn. 1.21 and then substituting from eqn. 1.14.

$$\frac{\partial J}{\partial b_j(o_t)} = -\frac{\gamma_t(j)}{b_j(o_t)}, \quad (1.30)$$

[0240] If the continuous densities are used then

$$\frac{\partial J}{\partial c_{jm}}, \frac{\partial J}{\partial \mu_{jm}} \text{ and } \frac{\partial J}{\partial \Sigma_{jm}}$$

can be found by further propagating the derivative

$$\frac{\partial J}{\partial b_j(O_i)}$$

using the chain rule.

The same method can be used to propagate the derivative (if necessary) to a front end processor of the HMM. This will be discussed in detail later.

[0241] Maximum Mutual Information (MMI) Criterion

[0242] In ML we optimize an HMM of only one class at a time, and do not touch the HMMs for other classes at that time. This procedure does not involve the concept “discrimination” which is of great interest in Pattern Recognition. Thus the ML learning procedure gives a poor discrimination ability to the HMM system, specially when the estimated parameters (in the training phase) of the HMM system do not match with the inputs used in the recognition phase. This type of mismatches can arise due to two reasons. One is that the training and recognition data may have considerably different statistical properties, and the other is the difficulties of obtaining reliable parameter estimates in the training.

[0243] The MMI criterion on the other hand consider HMMs of all the classes simultaneously, during training. Parameters of the correct model are updated to enhance its contribution to the observations, while parameters of the alternative models are updated to reduce their contributions. This procedure gives a high discriminative ability to the system and thus MMI belongs to the so called “discriminative training” category.

[0244] In order to have a closer look at the MMI criterion, consider a set of HMMs

$$\Lambda = \{\lambda_v, 1 \leq v \leq V\}.$$

[0245] The task is to minimize the conditional uncertainty of a class v of utterances given an observation sequence O^* of that class. This is equivalent minimize the conditional information,

$$I(v|O^*, \Lambda) = -\log p\{v|O^*, \Lambda\} \quad (1.31)$$

[0246] with respect to Λ .

[0247] In an information theoretical frame work this leads to the minimization of conditional entropy, defined as the expectation ($E(\bullet)$) of the conditional information I ,

$$H(V|O) = E[I(v|O^*)]. \quad (1.32)$$

[0248] where V represents all the classes and O represents all the observation sequences. Then the mutual information between the classes and observations,

$$H(V, O) = H(V) - H(V|O) \quad (1.33)$$

[0249] become maximized; provided $H(V)$ is constant. This is the reason for calling it Maximum Mutual Information (MMI) criterion. The other name of the method, Maximum A Posteriori (MAP) has the roots in eqn. 1.31 where the a posteriori probability $p\{v|O^*, \Lambda\}$ is maximized.

[0250] Even though the eqn. 1.31 defines the MMI criterion, it can be rearranged using the Bayes theorem to obtain a better insight, as in eqn. 1.34.

$$E_{MMI} = -\log p\{v|O^*, \Lambda\} \quad (1.34)$$

$$\begin{aligned} &= -\log \frac{p\{v, O^* | \Lambda\}}{p\{O^* | \Lambda\}} \\ &= -\log \frac{p\{v, O^* | \Lambda\}}{\sum_w p\{w, O^* | \Lambda\}} \end{aligned}$$

[0251] where w represents an arbitrary class.

[0252] If we use an analogous notation as in eqn. 1.9, we can write the likelihoods,

$$L_{tot}^{clamped} = p\{v, O^* | \lambda\} \quad (1.35)$$

$$L_{tot}^{free} = \sum_w p\{w, O^* | \lambda\} \quad (1.36)$$

[0253] In the above equations the superscripts clamped and free are used to imply the correct class and all the other classes respectively.

[0254] If we substitute eqns. 1.35 and 1.36 in the eqn. 1.34, we get,

$$E_{MMI} = -\log \frac{L_{tot}^{clamped}}{L_{tot}^{free}} \quad (1.37)$$

[0255] As in the case of ML re-estimation $\square$ or gradient methods can be used to minimize the quantity E_{MMI} . In the following a gradient based method, which again makes use of the eqn. 1.19, is described.

[0256] Since E_{MMI} is to be minimized, in this case $J = E_{MMI}$,

[0257] and therefore J is directly given by eqn. 1.37. The problem then simplifies to the calculation of gradients

$$\frac{\partial J}{\partial \Theta},$$

where Θ is an arbitrary parameter of the whole set of HMMs, Λ . This can be done by differentiating 1.37 with respect to Θ ,

$$\frac{\partial J}{\partial \Theta} = \frac{1}{L_{tot}^{free}} \frac{\partial L_{tot}^{free}}{\partial \Theta} - \frac{1}{L_{tot}^{clamped}} \frac{\partial L_{tot}^{clamped}}{\partial \Theta} \quad (1.38)$$

[0258] The same technique, as in the case of ML, can be used to compute the gradients of the likelihoods with respect to the parameters. As a first step likelihoods from eqns. 1.35 and 1.36, are expressed in terms of forward and backward variables using the form as in eqn. 1.7.

$$L_{tot}^{clamped} = \sum_{i \in class v} \alpha_i(i) \beta_i(i) \quad (1.39)$$

$$L_{tot}^{free} = \sum_w \sum_{i \in class w} \alpha_i(i) \beta_i(i) \quad (1.40)$$

[0259] Then the required gradients can be found by differentiating eqns. 1.39 and 1.40. But we consider two cases; one

for the transition probabilities and another for the observation probabilities, similar to the case of ML.

[0260] Maximum Mutual Information (MMI) Criterion

[0261] The MMI criterion considers HMMs of all the classes simultaneously, during training. Parameters of the correct model are updated to enhance its contribution to the observations, while parameters of the alternative models are updated to reduce their contributions. This procedure gives a high discriminative ability to the system and thus MMI belongs to the so called “discriminative training” category.

[0262] In order to have a closer look at the MMI criterion, consider a set of HMMs

$$\Lambda = \{\lambda_v, 1 \leq v \leq V\}.$$

[0263] The task is to minimize the conditional uncertainty of a class v of utterances given an observation sequence O^* of that class. This is equivalent to minimize the conditional information,

$$I(v|O^*, \Lambda) = -\log p\{v|O^*, \Lambda\} \quad (1.31)$$

[0264] with respect to Λ .

In an information theoretical frame work this leads to the minimization of conditional entropy, defined as the expectation ($E(\bullet)$) of the conditional information I ,

$$H(V|O) = E[I(v|O^*)] \quad (1.32)$$

[0265] where V represents all the classes and O represents all the observation sequences. Then the mutual information between the classes and observations,

$$H(V, O) = H(V) - H(V|O) \quad (1.33)$$

[0266] become maximized; provided $H(V)$ is constant. This is the reason for calling it Maximum Mutual Information (MMI) criterion. The other name of the method, Maximum A Posteriori (MAP) has the roots in eqn. 1.31 where the a posteriori probability $p\{v|O^*, \Lambda\}$ is maximized.

[0267] Even though the eqn. 1.31 defines the MMI criterion, it can be rearranged using the Bayes theorem to obtain a better insight, as in eqn. 1.34.

$$\begin{aligned} E_{MMI} &= -\log p\{v|O^*, \Lambda\} \quad (1.34) \\ &= -\log \frac{p\{v, O^* | \Lambda\}}{p\{O^* | \Lambda\}} \\ &= -\log \frac{p\{v, O^* | \Lambda\}}{\sum_w p\{w, O^* | \Lambda\}} \end{aligned}$$

[0268] where w represents an arbitrary class.

[0269] If we use an analogous notation as in eqn. 1.9, we can write the likelihoods,

$$L_{tot}^{clamped} = p\{v, O^* | \lambda\} \quad (1.35)$$

$$L_{tot}^{free} = \sum_w p\{w, O^* | \lambda\} \quad (1.36)$$

[0270] In the above equations the superscripts clamped and free are used to imply the correct class and all the other classes respectively.

[0271] If we substitute eqns. 1.35 and 1.36 in the eqn. 1.34, we get,

$$E_{MMI} = -\log \frac{L_{tot}^{clamped}}{L_{tot}^{free}} \quad (1.37)$$

[0272] As in the case of ML re-estimation or gradient methods can be used to minimize the quantity E_{MMI} . In the following a gradient based method, which again makes use of the eqn. 1.19, is described.

[0273] Since E_{MMI} is to be minimized, in this case $J = E_{MMI}$,

[0274] and therefore J is directly given by eqn. 1.37. The problem then simplifies to the calculation of gradients

$$\frac{\partial J}{\partial \Theta},$$

where Θ is an arbitrary parameter of the whole set of HMMs, Λ . This can be done by differentiating 1.37 with respect to Θ ,

$$\frac{\partial J}{\partial \Theta} = \frac{1}{L_{tot}^{free}} \frac{\partial L_{tot}^{free}}{\partial \Theta} - \frac{1}{L_{tot}^{clamped}} \frac{\partial L_{tot}^{clamped}}{\partial \Theta} \quad (1.38)$$

[0275] The same technique, as in the case of ML, can be used to compute the gradients of the likelihoods with respect to the parameters. As a first step likelihoods from eqns. 1.35 and 1.36, are expressed in terms of forward and backward variables using the form as in eqn. 1.7.

$$L_{tot}^{clamped} = \sum_{i \in \text{class } v} \alpha_t(i) \beta_t(i) \quad (1.39)$$

$$L_{tot}^{free} = \sum_w \sum_{i \in \text{class } w} \alpha_t(i) \beta_t(i) \quad (1.40)$$

[0276] Then the required gradients can be found by differentiating eqns. 1.39 and 1.40. But we consider two cases; one for the transition probabilities and another for the observation probabilities, similar to the case of ML.

[0277] Gradient with Respect to Transition Probabilities

[0278] Using the chain rule for any of the likelihoods, free or clamped,

$$\frac{\partial L_{tot}^{(\cdot)}}{\partial a_{ij}} = \sum_{t=1}^T \frac{\partial L_{tot}^{(\cdot)}}{\partial \alpha_t(j)} \frac{\partial \alpha_t(j)}{\partial a_{ij}} \quad (1.41)$$

[0279] Differentiating eqns. 1.39 and 1.40 with respect to $\alpha_t(j)$, to get two results for free and clamped cases and using the common result in eqn. 1.25, we get substitutions for both terms on the right hand side of eqn. 1.41. This substitution yields two separate results for free and clamped cases.

$$\frac{\partial L_{tot}^{clamped}}{\partial a_{ij}} = \delta_{kv} \sum_{t=1}^T \beta_t(j) b_j(o_t) \alpha_{t-1}(i), \quad (1.42)$$

$i \in \text{class } k$

[0280] where δ_{kv} is a Kronecker delta.

$$\frac{\partial L_{tot}^{free}}{\partial a_{ij}} = \sum_{t=1}^T \beta_t(j) b_j(o_t) \alpha_{t-1}(i) \quad (1.43)$$

[0281] Substitution of eqns. 1.42 and 1.43 in the eqn. 1.38 (keeping in mind that $\Theta = \alpha_{ij}$ in this case) gives the required result,

$$\frac{\partial J}{\partial a_{ij}} = \left[\frac{1}{L_{tot}^{free}} - \frac{\delta_{kv}}{L_{tot}^{clamped}} \right] \sum_{t=1}^T \beta_t(j) b_j(o_t) \alpha_{t-1}(i), \quad (1.44)$$

$i \in \text{class } k$

[0282] Gradient with Respect to Observation Probabilities

[0283] Using the chain rule for any of the likelihoods, free or clamped,

$$\frac{\partial L_{tot}^{(i)}}{\partial b_j(o_t)} = \frac{\partial L_{tot}^{(i)}}{\partial \alpha_t(j)} \frac{\partial \alpha_t(j)}{\partial b_j(o_t)} \quad (1.45)$$

[0284] Differentiating eqns. 1.39 and 1.40 with respect to $\alpha_t(j)$, to get two results for free and clamped cases, and using the common result in eqn. 1.28, we get substitutions for both terms on the right hand side of eqn. 1.45. This substitution yields two separate results for free and clamped cases.

$$\frac{\partial L_{tot}^{clamped}}{\partial b_j(o_t)} = \delta_{kv} \frac{\alpha_t(j) \beta_t(j)}{b_j(o_t)}, \quad (1.46)$$

$j \in \text{class } k$

[0285] where δ_{kv} is a Kronecker delta. And

$$\frac{\partial L_{tot}^{free}}{\partial b_j(o_t)} = \frac{\alpha_t(j) \beta_t(j)}{b_j(o_t)} \quad (1.47)$$

[0286] Substitution of eqns. 1.46 and 1.47 in eqn. 1.38 we get the required result,

$$\frac{\partial J}{\partial b_j(o_t)} = \left[\frac{1}{L_{tot}^{free}} - \frac{\delta_{kv}}{L_{tot}^{clamped}} \right] \frac{\alpha_t(j) \beta_t(j)}{b_j(o_t)}, \quad (1.48)$$

$j \in \text{class } k$

[0287] This equation can be given a more aesthetic form by defining,

$$\gamma_t(j)^{clamped} = \delta_{kv} \frac{\alpha_t(j) \beta_t(j)}{L_{tot}^{clamped}}, \quad j \in \text{class } k \quad (1.49)$$

[0288] where δ_{kv} is a Kronecker delta, and

$$\gamma_t(j)^{free} = \frac{\alpha_t(j) \beta_t(j)}{L_{tot}^{clamped}}. \quad (1.50)$$

[0289] With these variables we express the eqn. 1.48 in the following form.

$$\frac{\partial J}{\partial b_j(o_t)} = \frac{1}{b_j(o_t)} [\gamma_t(j)^{free} - \gamma_t(j)^{clamped}] \quad (1.51)$$

[0290] This equation completely defines the update of observation probabilities. If however continuous densities are used then we can further propagate this derivative using the chain rule, in exactly the same way as mentioned in the case ML. A similar comments are valid also for preprocessors.

[0291] Training

[0292] We assume that the preprocessing part of the system gives out a sequence of observation vectors

$$O = \{o_1, o_2, \dots, o_N\}.$$

[0293] Starting from a certain set of values, parameters of each of the HMMs

$$\lambda_i, 1 \leq i \leq N$$

[0294] can be updated as given by the eqn. 1.19, while the required gradients will be given by eqns. 1.44 and 1.48. However for this particular case, isolated recognition, likelihoods in the last two equations are calculated in a peculiar way.

First consider the clamped case. Since we have an HMM for each class of units in isolated recognition, we can select the model λ_t of the class I to which the current observation sequence O^1 belongs. Then starting from eqn. 1.39,

$$\begin{aligned} L_{tot}^{clamped} &= L_t^I \\ &= \sum_{i \in \lambda_t} \alpha_t(i) \beta_t(i) \\ &= \sum_{i \in \lambda_t} \alpha_T(i) \end{aligned} \quad (1.52)$$

[0295] where the second line follows from eqn. 1.3.

[0296] Similarly for the free case, starting from eqn. 1.40,

$$L_{tot}^{free} = \sum_{m=1}^N L_m^I \quad (1.53)$$

$$= \sum_{m=1}^N \left[\sum_{i \in \lambda_m} \alpha_t(i) \beta_t(i) \right]$$

$$= \sum_{m=1}^N \sum_{i \in \lambda_m} \alpha_T(i)$$

[0297] where L_m^I represents the likelihood of the current observation sequence belonging to class I, in the model λ_m . With those likelihoods defined in eqns. 1.52 and 1.53, the gradient giving equations 1.44 and 1.48 will take the forms,

$$\frac{\partial J}{\partial a_{ij}} = \left[\frac{1}{\sum_{m=1}^N L_m^i} - \frac{\delta_{kl}}{L_i^l} \right] \sum_{t=1}^T \beta_t(j) b_j(o_t) \alpha_{t-1}(i), \quad i, j \in \lambda_k \quad (1.54)$$

$$\frac{\partial J}{\partial b_j(o_t)} = \left[\frac{1}{\sum_{m=1}^N L_m^l} - \frac{\delta_{kl}}{L_i^l} \right] \frac{\alpha_t(j) \beta_t(j)}{b_j(o_t)}, \quad j \in \lambda_k \quad (1.55)$$

[0298] Now we can summarize the training procedure as follows.

[0299] (1) Initialize the each HMM, $\lambda_i = (\Lambda_i, B_i, \pi_i)$, $1 \leq i \leq N$ with values generated randomly or using an initialization algorithm like segmental K means [<http://jedlik.phy.bme.hu/~gerjanos/HMM/node19.html—r4#r4>].

[0300] (2) Take an observation sequence and

[0301] Calculate the forward and backward probabilities for each HMM, using the recursions 1.5 and 1.2.

[0302] Using the equations 1.52 and 1.53 calculate the likelihoods

[0303] Using the equations 1.54 and 1.55 calculate the gradients with respect to parameters for each model

[0304] Update parameters in each of the models using the eqn. 1.19.

[0305] (3) Go to step (2), unless all the observation sequences are considered.

[0306] (4) Repeat step (2) to (3) until a convergence criterion is satisfied.

[0307] This procedure can easily be modified if the continuous density HMMs are used, by propagating the gradients via chain rule to the parameters of the continuous probability distributions. Further it is worth to mention that preprocessors can also be trained simultaneously, with such a further back propagation.

[0308] Recognition

[0309] Comparative to the training, recognition is much simpler and the procedure is given below.

[0310] (1) Take an observation sequence to be recognized and

[0311] Calculate the forward and backward probabilities for each HMM, using the recursions 1.5 and 1.2.

[0312] As in the equation 1.53 calculate the likelihoods, L_m^t , $1 \leq m \leq N$

[0313] The recognized class l^* , to which the observation sequence belongs, is given by

$$l^* = \arg \max_{1 \leq m \leq N} L_m^t.$$

[0314] (3) Go to step (2), unless all the observation sequences to be recognized are considered.

[0315] The recognition rate in this case can be calculated as the ratio between number of correctly recognized speech units and total number of speech units (observation sequences) to be recognized.

[0316] Use of Fourier Transform in Pre-Processing

[0317] The Hartley Transform is an integral transform which shares some features with the Fourier Transform, but which (in the discrete case), multiplies the kernel by

$$\cos\left(\frac{2\pi kn}{N}\right) - \sin\left(\frac{2\pi kn}{N}\right) \quad 1)$$

[0318] instead of

$$e^{-2\pi i kn} = \cos\left(\frac{2\pi kn}{N}\right) - i \sin\left(\frac{2\pi kn}{N}\right). \quad 2)$$

[0319] The Hartley transform produces real output for a real input, and is its own inverse. It therefore can have computational advantages over the discrete Fourier transform, although analytic expressions are usually more complicated for the Hartley transform.

[0320] The discrete version of the Hartley transform can be written explicitly as

$$\mathcal{H}[a] : \frac{1}{\sqrt{N}} \sum_{n=0}^{N-1} a_n \left[\cos\left(\frac{2\pi kn}{N}\right) - \sin\left(\frac{2\pi kn}{N}\right) \right] \quad 3)$$

$$: \Re \mathcal{F}[a] - \Im \mathcal{F}[a], \quad 4)$$

[0321] where $\mathcal{F}$ denotes the Fourier Transform. The Hartley transform obeys the convolution property

$$\mathcal{H}[a * b]_k = \frac{1}{2} (A_k B_k - \bar{A}_k \bar{B}_k + A_k \bar{B}_k + \bar{A}_k B_k), \quad 5)$$

[0322] where

$$\bar{a}_0 = a_0 \quad 6)$$

$$\bar{a}_{n/2} = a_{n/2} \quad 7)$$

$$\bar{a}_k = a_{n-k} \quad 8)$$

(Arndt). Like the fast Fourier Transform algorithm, there is a “fast” version of the Hartley transform algorithm. A decimation in time algorithm makes use of

$$\mathcal{H}_n^{\text{left}}[a] = \mathcal{H}_{n/2}[a^{\text{even}}] + X \mathcal{H}_{n/2}[a^{\text{odd}}] \quad 9)$$

$$\mathcal{H}_n^{\text{right}}[a] = \mathcal{H}_{n/2}[a^{\text{even}}] - X \mathcal{H}_{n/2}[a^{\text{odd}}], \quad 10)$$

[0323] where X denotes the sequence with elements

$$a_n \cos\left(\frac{\pi n}{N}\right) - \bar{a}_n \sin\left(\frac{\pi n}{N}\right). \quad 11)$$

[0324] A decimation in frequency algorithm makes use of

$$\mathcal{H}_n^{\text{even}}[a] = \mathcal{H}_{n/2}[a^{\text{left}} + a^{\text{right}}], \quad 12)$$

$$\mathcal{H}_n^{\text{odd}}[a] = \mathcal{H}_{n/2}[X(a^{\text{left}} - a^{\text{right}})]. \quad 13)$$

[0325] The discrete Fourier transform

$$A_k \equiv \mathcal{F}[a] = \sum_{n=0}^{N-1} e^{-2\pi i kn/N} a_n \quad 14)$$

[0326] can be written

$$\begin{bmatrix} A_k \sum_{n=0}^{N-1} \begin{bmatrix} e^{-2\pi i k n / N} & 0 \\ 0 & e^{2\pi i k n / N} \end{bmatrix} \begin{bmatrix} a_n \\ a_n \end{bmatrix} \\ A_{-l} \end{bmatrix} \quad (15)$$

$$\sum_{n=0}^{N-1} \frac{1}{2} \begin{bmatrix} 1-i & 1+i \\ 1+i & 1-i \end{bmatrix} \begin{bmatrix} \cos\left(\frac{2\pi k n}{N}\right) & \sin\left(\frac{2\pi k n}{N}\right) \\ -\sin\left(\frac{2\pi k n}{N}\right) & \cos\left(\frac{2\pi k n}{N}\right) \end{bmatrix} \frac{1}{2} \begin{bmatrix} 1+i & 1-i \\ 1-i & 1+i \end{bmatrix} \begin{bmatrix} a_n \\ a_n \end{bmatrix}, \quad (16)$$

so $F = T^{-1}HT$.

[0327] See, <http://mathworld.wolfram.com/HartleyTransform.html>.

[0328] A Hartley transform based fixed pre-processing may be considered, on some bases, inferior to that based on Fourier transform. One explanation for this is based on the respective symmetries and shift invariance properties. Therefore we expect improved performances from Fourier transform even when the pre-processing is adaptive. However a training procedure which preserves the symmetries of weight distributions must be used. Main argument of the use of Hartley transform is to avoid the complex weights. A Fourier transform, however, can be implemented as a neural network containing real weights, but with a slightly modified network structure than the usual MLP. We can easily derive the equations which give the forward and backward pass.

[0329] Forward pass is given by,

$$\left[\sum_{i=0}^{N-1} x_i(i) \cos\left(\frac{2\pi i j}{N}\right) \right]^2 + \left[\sum_{i=0}^{N-1} x_i(i) \sin\left(\frac{2\pi i j}{N}\right) \right]^2 = \tilde{X}_t^2(j) \quad (2.1)$$

[0330] where N denotes the window length, and $\tilde{X}_t(j) = |X_t(j)|$

[0331] If we use the notation

$$\theta_{ij} = \frac{2\pi i j}{N},$$

[0332] and error is denoted by J, then we can find

$$\frac{\partial J}{\partial \theta_{ij}}$$

simply by using the chain rule,

$$\frac{\partial J}{\partial \theta_{ij}} = \sum_{t=1}^T \frac{\partial J}{\partial \tilde{X}_t^2(j)} \frac{\partial \tilde{X}_t^2(j)}{\partial \theta_{ij}} \quad (2.2)$$

[0333] We assume that

$$\frac{\partial J}{\partial \tilde{X}_t^2(j)}$$

is known and

$$\frac{\partial \tilde{X}_t^2(j)}{\partial \theta_{ij}}$$

can simply be found by differentiating eqn. 2.1 with respect to θ_{ij} . Thus we get,

$$\frac{\partial \tilde{X}_t^2(j)}{\partial \theta_{ij}} = 2x_t(i) \cos(\theta_{ij}) \sum_{k=1}^{N-1} x_t(k) \sin(\theta_{kj}) - 2x_t(i) \sin(\theta_{ij}) \sum_{k=1}^{N-1} x_t(k) \cos(\theta_{kj}) \quad (2.3)$$

[0334] Eqns. 2.2 and 2.3 define the backward pass. Note that θ_{ij} can be further back propagated as usual.

[0335] Training Procedure which Preserves Symmetry

[0336] We can use a training procedure which preserves symmetrical distribution of weights in the Hartley or Fourier transform stages. In addition to the improved shift invariance, this approach can lead to parameter reduction. The procedure starts by noting the equal weights at initialization. Then the forward and backward passes are performed as usual. But in updating we use the same weight update for all the equal weights, namely the average value of all the weight updates corresponding to the equal weights. In this way we can preserve any existing symmetry in the initial weight distributions. At the same time number of parameters is reduced because only one parameter is needed to represent the whole class of equal weights.

[0337] See, "A Hybrid ANN-HMM ASR system with NN based adaptive preprocessing", Narada Dilp Warakagoda, M. Sc. thesis (Norges Tekniske Høgskole, Institutt for Teleteknikk Transmisjonsteknikk), <http://jedlik.phy.bme.hu/~gerjanos/HMM/hoved.html>.

[0338] As an alternate to the Hartley transform, a Wavelet transform may be applied.

[0339] The fast Fourier transform (FFT) and the discrete wavelet transform (DWT) are both linear operations that generate a data structure that contains segments of various lengths, usually filling and transforming it into a different data vector of length.

[0340] The mathematical properties of the matrices involved in the transforms are similar as well. The inverse transform matrix for both the FFT and the DWT is the transpose of the original. As a result, both transforms can be viewed as a rotation in function space to a different domain. For the FFT, this new domain contains basis functions that are sines and cosines. For the wavelet transform, this new domain contains more complicated basis functions called wavelets, mother wavelets, or analyzing wavelets.

[0341] Both transforms have another similarity. The basis functions are localized in frequency, making mathematical tools such as power spectra (how much power is contained in a frequency interval) and scalegrams (to be defined later) useful at picking out frequencies and calculating power distributions.

[0342] The most interesting dissimilarity between these two kinds of transforms is that individual wavelet functions are localized in space. Fourier sine and cosine functions are

not. This localization feature, along with wavelets' localization of frequency, makes many functions and operators using wavelets "sparse" when transformed into the wavelet domain. This sparseness, in turn, results in a number of useful applications such as data compression, detecting features in images, and removing noise from time series.

[0343] One way to see the time-frequency resolution differences between the Fourier transform and the wavelet transform is to look at the basis function coverage of the time-frequency plane.

[0344] In a windowed Fourier transform, where the window is simply a square wave, the square wave window truncates the sine or cosine function to fit a window of a particular width. Because a single window is used for all frequencies in the WFT, the resolution of the analysis is the same at all locations in the time-frequency plane.

[0345] An advantage of wavelet transforms is that the windows vary. In order to isolate signal discontinuities, one would like to have some very short basis functions. At the same time, in order to obtain detailed frequency analysis, one would like to have some very long basis functions. A way to achieve this is to have short high-frequency basis functions and long low-frequency ones. This happy medium is exactly what you get with wavelet transforms.

[0346] One thing to remember is that wavelet transforms do not have a single set of basis functions like the Fourier transform, which utilizes just the sine and cosine functions. Instead, wavelet transforms have an infinite set of possible basis functions. Thus wavelet analysis provides immediate access to information that can be obscured by other time-frequency methods such as Fourier analysis.

[0347] Wavelet transforms comprise an infinite set. The different wavelet families make different trade-offs between how compactly the basis functions are localized in space and how smooth they are.

[0348] Some of the wavelet bases have fractal structure. The Daubechies wavelet family is one example.

[0349] Within each family of wavelets (such as the Daubechies family) are wavelet subclasses distinguished by the number of coefficients and by the level of iteration. Wavelets are classified within a family most often by the number of vanishing moments. This is an extra set of mathematical relationships for the coefficients that must be satisfied, and is directly related to the number of coefficients. For example, within the Coiflet wavelet family are Coiflets with two vanishing moments, and Coiflets with three vanishing moments.

[0350] The Discrete Wavelet Transform

[0351] Dilations and translations of the "Mother function," or "analyzing wavelet" $\Phi(x)$ define an orthogonal basis, our wavelet basis:

$$\Phi_{(sl)}(x) = 2^{-\frac{s}{2}} \Phi(2^{-s}x - l) \quad (3)$$

[0352] The variables s and l are integers that scale and dilate the mother function $\Phi(x)$ to generate wavelets, such as a Daubechies wavelet family. The scale index s indicates the wavelet's width, and the location index l gives its position. Notice that the mother functions are rescaled, or "dilated" by powers of two, and translated by integers. What makes wavelet bases especially interesting is the self-similarity caused by the scales and dilations. Once we know about the mother functions, we know everything about the basis. Note that the

scaling-by-two is a feature of the Discrete Wavelet Transform (DWT), and is not, itself, compelled by Wavelet theory. That is, while it is computationally convenient to employ a binary tree, in theory, if one could define a precise wavelet that corresponds to a feature of a data set to be processed, this wavelet could be directly extracted. Clearly, the utility of the DWT is its ability to handle general cases without detailed pattern searching, and therefore the more theoretical wavelet transform techniques based on precise wavelet matching are often reserved for special cases. On the other hand, by carefully selecting wavelet basis functions, or combinations of basis functions, a very sparse representation of a complex and multidimensional data space may be obtained. The utility, however, may depend on being able to operate in the wavelet transform domain (or subsequent transforms of the sparse representation coefficients) for subsequent analysis. Note that, while wavelets are generally represented as two dimensional functions of amplitude and time, it is clear that wavelet theory extends into n -dimensional space.

[0353] Thus, the advantageous application of wavelet theory is in cases where a modest number of events, for example having associated limited time and space parameters, are represented in a large data space. If the events could be extracted with fair accuracy, the data space could be replaced with a vector quantized model (VQM), wherein the extracted events correspond to real events, and wherein the VQM is highly compressed as compared to the raw data space. Further, while there may be some data loss as a result of the VQM expression, if the real data corresponds to the wavelet used to model it, then the VQM may actually serve as a form of error correction. Clearly, in some cases, especially where events are overlapping, the possibility for error occurs. Further, while the DWT is often useful in denoising data, in some cases, noise may be inaccurately represented as an event, while in the raw data space, it might have been distinguished. Thus, one aspect of a denoised DWT representation is that there is an implicit presumption that all remaining elements of the representation matrix are signal.

[0354] A particular advantage of a DWT approach is that it facilitates a multiresolution analysis of data sets. That is, if decomposition of the raw data set with the basis function, transformed according to a regular progressions, e.g., powers of 2, then at each level of decomposition, a level of scale is revealed and presented. It is noted that the transform need not be a simple power of two, and itself may be a function or complex and/or multidimensional function. Typically, non-standard analyses are reserved for instances where there is, or is believed to be, a physical basis for the application of such functions instead of binary splitting of the data space.

[0355] Proceeding with the DWT analysis, we span our data domain at different resolutions, see www.eso.org/projects/esomidas/doc/user/98NOV/volb/node308.html, using the analyzing wavelet in a scaling equation:

$$W(x) = \sum_{k=-1}^{N-2} (-1)^k c_{k+1} \Phi(2x + k) \quad (4)$$

[0356] where $W(x)$ is the scaling function for the mother function $\Phi(x)$, and c_k are the wavelet coefficients. The wavelet coefficients must satisfy linear and quadratic constraints of the form

$$\sum_{k=0}^{N-1} c_k = 2, \quad \sum_{k=0}^{N-1} c_k c_{k+2l} = 2\delta_{l,0}$$

[0357] where δ is the delta function and l is the location index.

[0358] One of the most useful features of wavelets is the ease with which one can choose the defining coefficients for a given wavelet system to be adapted for a given problem. In Daubechies' original paper, I. Daubechies, "Orthonormal Bases of Compactly Supported Wavelets," *Comm. Pure Appl. Math.*, Vol 41, 1988, pp. 906-966, she developed specific families of wavelet systems that were very good for representing polynomial behavior. The Haar wavelet is even simpler, and it is often used for educational purposes. (That is, while it may be limited to certain classes of problems, the Haar wavelet often produces comprehensible output which can be generated into graphically pleasing results).

[0359] It is helpful to think of the coefficients $\{c_0, \dots, c_n\}$ as a filter. The filter or coefficients are placed in a transformation matrix, which is applied to a raw data vector. The coefficients are ordered using two dominant patterns, one that works as a smoothing filter (like a moving average), and one pattern that works to bring out the data's "detail" information. These two orderings of the coefficients are called a quadrature mirror filter pair in signal processing parlance. A more detailed description of the transformation matrix can be found in W. Press et al., *Numerical Recipes in Fortran*, Cambridge University Press, New York, 1992, pp. 498-499, 584-602.

[0360] To complete our discussion of the DWT, let's look at how the wavelet coefficient matrix is applied to the data vector. The matrix is applied in a hierarchical algorithm, sometimes called a pyramidal algorithm. The wavelet coefficients are arranged so that odd rows contain an ordering of wavelet coefficients that act as the smoothing filter, and the even rows contain an ordering of wavelet coefficient with different signs that act to bring out the data's detail. The matrix is first applied to the original, full-length vector. Then the vector is smoothed and decimated by half and the matrix is applied again. Then the smoothed, halved vector is smoothed, and halved again, and the matrix applied once more. This process continues until a trivial number of "smooth-smooth-smooth . . ." data remain. That is, each matrix application brings out a higher resolution of the data while at the same time smoothing the remaining data. The output of the DWT consists of the remaining "smooth (etc.)" components, and all of the accumulated "detail" components.

[0361] The Fast Wavelet Transform

[0362] If the DWT matrix is not sparse, so we face the same complexity issues that we had previously faced for the discrete Fourier transform. Wickerhauser, *Adapted Wavelet Analysis from Theory to Software*, A K Peters, Boston, 1994, pp. 213-214, 237, 273-274, 387. We solve it as we did for the FFT, by factoring the DWT into a product of a few sparse matrices using self-similarity properties. The result is an algorithm that requires only order n operations to transform an n -sample vector. This is the "fast" DWT of Mallat and Daubechies.

[0363] Wavelet Packets

[0364] The wavelet transform is actually a subset of a far more versatile transform, the wavelet packet transform. M. A. Cody, "The Wavelet Packet Transform," *Dr. Dobb's Journal*, Vol 19, April 1994, pp. 44-46, 50-54.

[0365] Wavelet packets are particular linear combinations of wavelets. V. Wickerhauser, *Adapted Wavelet Analysis from Theory to Software*, A K Peters, Boston, 1994, pp. 213-214, 237, 273-274, 387. They form bases which retain many of the orthogonality, smoothness, and localization properties of their parent wavelets. The coefficients in the linear combinations are computed by a recursive algorithm making each newly computed wavelet packet coefficient sequence the root of its own analysis tree.

[0366] Adapted Waveforms

[0367] Because we have a choice among an infinite set of basis functions, we may wish to find the best basis function for a given representation of a signal. Wickerhauser, Id. A basis of adapted waveform is the best basis function for a given signal representation. The chosen basis carries substantial information about the signal, and if the basis description is efficient (that is, very few terms in the expansion are needed to represent the signal), then that signal information has been compressed.

[0368] According to Wickerhauser, Id., some desirable properties for adapted wavelet bases are

[0369] 1. speedy computation of inner products with the other basis functions;

[0370] 2. speedy superposition of the basis functions;

[0371] 3. good spatial localization, so researchers can identify the position of a signal that is contributing a large component;

[0372] 4. good frequency localization, so researchers can identify signal oscillations; and

[0373] 5. independence, so that not too many basis elements match the same portion of the signal.

[0374] For adapted waveform analysis, researchers seek a basis in which the coefficients, when rearranged in decreasing order, decrease as rapidly as possible. to measure rates of decrease, they use tools from classical harmonic analysis including calculation of information cost functions. This is defined as the expense of storing the chosen representation. Examples of such functions include the number above a threshold, concentration, entropy, logarithm of energy, Gauss-Markov calculations, and the theoretical dimension of a sequence.

[0375] Multiresolution analysis results from the embedded subsets generated by the interpolations at different scales.

[0376] A function $f(x)$ is projected at each step j onto the subset V_j . This projection is defined by the scalar product $c_j(k)$ of $f(x)$ with the scaling function $\phi(x)$ which is dilated and translated:

$$c_j(k) = \langle f(x), 2^{-j}\phi(2^{-j}x - k) \rangle$$

[0377] As $\phi(x)$ is a scaling function which has the property:

$$\frac{1}{2}\phi\left(\frac{x}{2}\right) = \sum_n h(n)\phi(x - n) \text{ or } \hat{\phi}(2v) = \hat{h}(v)\hat{\phi}(v)$$

[0378] where $\hat{h}(v)$ is the Fourier transform of the function $\sum_n h(n)\delta(x - n)$. We get:

$$\hat{h}(v) = \sum_n h(n)e^{-2\pi i n v}$$

[0379] The property of the scaling function of $\phi(x)$ is that it permits us to compute directly the set $c_{j+1}(k)$ from $c_j(k)$. If we start from the set $c_0(k)$ we compute all the sets $c_j(k)$, with $j > 0$, without directly computing any other scalar product:

$$c_{j+1}(k) = \sum_n h(n-2k)c_j(n)$$

[0380] At each step, the number of scalar products is divided by 2. Step by step the signal is smoothed and information is lost. The remaining information can be restored using the complementary subspace W_{j+1} of V_{j+1} in V_j . This subspace can be generated by a suitable wavelet function $\psi(x)$ with translation and dilation.

$$\frac{1}{2}\psi\left(\frac{x}{2}\right) = \sum_n g(n)\phi(x-n) \text{ or } \hat{\psi}(2\nu) = \hat{g}(\nu)\hat{\phi}(\nu)$$

[0381] We compute the scalar products $\langle f(x), 2^{-(j+1)}\psi(2^{-(j+1)}x-k) \rangle$ with:

$$w_{j+1}(k) = \sum_n g(n-2k)c_j(n)$$

[0382] With this analysis, we have built the first part of a filter bank. In order to restore the original data, Mallat uses the properties of orthogonal wavelets, but the theory has been generalized to a large class of filters by introducing two other filters $\tilde{h}$ and $\tilde{g}$ named conjugated to h and g .

[0383] The restoration, that is, the inverse transform after filtering in the transform domain, is performed with:

$$c_j(k) = 2 \sum_l [c_{j+1}(l)\tilde{h}(k+2l) + w_{j+1}(l)\tilde{g}(k+2l)]$$

[0384] In order to get an exact restoration, two conditions are required for the conjugate filters:

[0385] Dealiasing condition:

$$\tilde{h}\left(\nu + \frac{1}{2}\right)\hat{h}(\nu) + \tilde{g}\left(\nu + \frac{1}{2}\right)\hat{g}(\nu) = 0$$

[0386] Exact restoration:

$$\hat{h}(\nu)\tilde{h}(\nu) + \hat{g}(\nu)\tilde{g}(\nu) = 1$$

[0387] In the decomposition, the function is successively convolved with the two filters H (low frequencies) and G (high frequencies). Each resulting function is decimated by suppression of one sample out of two. The high frequency signal is left, and we iterate with the low frequency signal. In the reconstruction, we restore the sampling by inserting a 0 between each sample, then we convolve with the conjugate filters $\tilde{H}$ and $\tilde{G}$, we add the resulting functions and we multiply the result by 2. We iterate up to the smallest scale.

[0388] Orthogonal wavelets correspond to the restricted case where:

$$\hat{g}(\nu) = e^{-2\pi i \nu} \hat{h}^*\left(\nu + \frac{1}{2}\right)$$

$$\hat{h}(\nu) = \hat{h}^*(\nu)$$

$$\hat{g}(\nu) = \hat{g}^*(\nu)$$

and

$$|\hat{h}(\nu)|^2 + \left|\hat{h}\left(\nu + \frac{1}{2}\right)\right|^2 = 1$$

[0389] We can easily see that this set satisfies the dealiasing condition and exact restoration condition. Daubechies wavelets are the only compact solutions. For biorthogonal wavelets we have the relations:

$$\hat{g}(\nu) = e^{-2\pi i \nu} \hat{h}^*\left(\nu + \frac{1}{2}\right)$$

$$\hat{g}(\nu) = e^{2\pi i \nu} \hat{h}^*\left(\nu + \frac{1}{2}\right)$$

and

$$\hat{h}(\nu)\hat{h}(\nu) + \hat{h}^*\left(\nu + \frac{1}{2}\right)\hat{h}^*\left(\nu + \frac{1}{2}\right) = 1$$

[0390] Which also satisfy the dealiasing condition and exact restoration condition. A large class of compact wavelet functions can be derived. Many sets of filters were proposed, especially for coding. The choice of these filters must be guided by the regularity of the scaling and the wavelet functions. The complexity is proportional to N . The algorithm provides a pyramid of N elements.

[0391] The 2D algorithm is based on separate variables leading to prioritizing of x and y directions. The scaling function is defined by:

$$\Phi(x,y) = \Phi(x)\Phi(y)$$

[0392] The passage from a resolution to the next one is done by:

$$f_{j+1}(k_x, k_y) = \sum_{l_x=-\infty}^{+\infty} \sum_{l_y=-\infty}^{+\infty} h(l_x - 2k_x)h(l_y - 2k_y)f_j(l_x, l_y)$$

[0393] The detail signal is obtained from three wavelets:

[0394] a vertical wavelet: $\psi^1(x,y) = \phi(x)\psi(y)$

[0395] a horizontal wavelet: $\psi^2(x,y) = \psi(x)\phi(y)$

[0396] a diagonal wavelet: $\psi^3(x,y) = \psi(x)\psi(y)$

[0397] which leads to three sub-images:

$$C_{j+1}^1(k_x, k_y) = \sum_{l_x=-\infty}^{+\infty} \sum_{l_y=-\infty}^{+\infty} g(l_x - 2k_x)h(l_y - 2k_y)f_j(l_x, l_y)$$

$$C_{j+1}^2(k_x, k_y) = \sum_{l_x=-\infty}^{+\infty} \sum_{l_y=-\infty}^{+\infty} h(l_x - 2k_x)g(l_y - 2k_y)f_j(l_x, l_y)$$

$$C_{j+1}^3(k_x, k_y) = \sum_{l_x=-\infty}^{+\infty} \sum_{l_y=-\infty}^{+\infty} g(l_x - 2k_x)g(l_y - 2k_y)f_j(l_x, l_y)$$

TABLE 1

Wavelet transform representation of an image (two dimensional matrix)			
$f^{(2)}$	H.D. $j = 2$	Horiz. Det. $j = 1$	Horizontal Details $j = 0$
V.D. $j = 2$	D.D. $j = 2$		
	Vert. Det. $j = 1$	Diag. Det. $j = 1$	
	Vertical Details $j = 0$		Diagonal Details $j = 0$

[0398] The wavelet transform can be interpreted as the decomposition on frequency sets with a spatial orientation.

[0399] The à Trouis Algorithm

[0400] The discrete approach of the wavelet transform can be done with the special version of the so-called à trous algorithm (with holes). One assumes that the sampled data $\{c_0(k)\}$ are the scalar products at pixels k of the function $f(x)$ with a scaling function $\phi(x)$ which corresponds to a low pass filter.

[0401] The first filtering is then performed by a twice magnified scale leading to the $\{c_1(k)\}$ set. The signal difference $\{c_0(k)\} - \{c_1(k)\}$ contains the information between these two scales and is the discrete set associated with the wavelet transform corresponding to $\phi(x)$. The associated wavelet is therefore $\psi(x)$.

$$\frac{1}{2}\psi\left(\frac{x}{2}\right) = \phi(x) - \frac{1}{2}\phi\left(\frac{x}{2}\right)$$

[0402] The distance between samples increasing by a factor 2 from the scale $(i-1)$ ($i>0$) to the next one, $c_i(k)$ is given by:

$$c_i(k) = \sum_l h(l)c_{i-1}(k + 2^{i-1}l)$$

[0403] and the discrete wavelet transform $w_i(k)$ by:

$$w_i(k) = c_{i-1}(k) - c_i(k)$$

[0404] The coefficients $\{h(k)\}$ derive from the scaling function $\phi(x)$:

$$\frac{1}{2}\phi\left(\frac{x}{2}\right) = \sum_l h(l)\phi(x - l)$$

[0405] The algorithm allowing one to rebuild the data frame is evident: the last smoothed array c_{mp} is added to all the differences w_i .

$$c_0(k) = c_{n_p}(k) \sum_{j=1}^{n_p} w_j(k)$$

[0406] If we choose the linear interpolation for the scaling function ϕ :

$$\phi(x) = 1 - |x| \text{ if } x \in [-1, 1]$$

$$\phi(x) = 0 \text{ if } x \notin [-1, 1]$$

[0407] we have:

$$\frac{1}{2}\phi\left(\frac{x}{2}\right) = \frac{1}{4}\phi(x+1) + \frac{1}{2}\phi(x) + \frac{1}{4}\phi(x-1)$$

[0408] c_1 is obtained by:

$$c_1(k) = \frac{1}{4}c_0(k-1) + \frac{1}{2}c_0(k) + \frac{1}{4}c_0(k+1)$$

[0409] and c_{j+1} is obtained from c_j by:

$$c_{j+1}(k) = \frac{1}{4}c_j(k-2^j) + \frac{1}{2}c_j(k) + \frac{1}{4}c_j(k+2^j)$$

[0410] The wavelet coefficients at the scale j are:

$$C_{j+1}(k) = -\frac{1}{4}c_j(k-2^j) + \frac{1}{2}c_j(k) - \frac{1}{4}c_j(k+2^j)$$

[0411] The above à trous algorithm is easily extensible to the two dimensional space. This leads to a convolution with a mask of 3×3 .

[0412] pixels for the wavelet connected to linear interpolation. The coefficients of the mask are:

$$\begin{pmatrix} \frac{1}{16} & \frac{1}{8} & \frac{1}{16} \\ \frac{1}{8} & \frac{1}{4} & \frac{1}{8} \\ \frac{1}{16} & \frac{1}{8} & \frac{1}{16} \end{pmatrix}$$

[0413] At each scale j , we obtain a set $\{w_j(k,l)\}$ (we will call it wavelet plane in the following), which has the same number of pixels as the image.

[0414] If we choose a B_3 -spline for the scaling function, the coefficients of the convolution mask in one dimension are $(\frac{1}{16}, \frac{1}{4}, \frac{3}{8}, \frac{1}{4}, \frac{1}{16})$, and in two dimensions:

$$\begin{pmatrix} \frac{1}{256} & \frac{1}{64} & \frac{3}{128} & \frac{1}{64} & \frac{1}{256} \\ \frac{1}{64} & \frac{1}{16} & \frac{3}{32} & \frac{1}{16} & \frac{1}{64} \\ \frac{3}{128} & \frac{3}{32} & \frac{9}{64} & \frac{3}{32} & \frac{3}{128} \\ \frac{1}{64} & \frac{1}{16} & \frac{3}{32} & \frac{1}{16} & \frac{1}{64} \\ \frac{1}{256} & \frac{1}{64} & \frac{3}{128} & \frac{1}{64} & \frac{1}{256} \end{pmatrix}$$

[0415] The Wavelet Transform Using the Fourier Transform

[0416] We start with the set of scalar products $c_0(k) = \langle f(x), \phi(x-k) \rangle$. If $\phi(x)$ has a cut-off frequency

$$\nu_c \leq \frac{1}{2}$$

the data are correctly sampled. The data at the resolution $j=1$ are:

$$c_1(k) = \left\langle f(x), \frac{1}{2} \phi\left(\frac{x}{2} - k\right) \right\rangle$$

[0417] and we can compute the set $c_1(k)$ from $c_0(k)$ with a discrete filter $\hat{h}(v)$:

$$\hat{h}(v) = \begin{cases} \frac{\hat{\phi}(2v)}{\hat{\phi}(v)} & \text{if } |v| < v_c \\ 0 & \text{if } v_c \leq |v| < \frac{1}{2} \end{cases}$$

and

$$\forall v: \forall n \hat{h}(v+n) = \hat{h}(v)$$

[0418] where n is an integer. So:

$$\hat{c}_{j+1}(v) = \hat{c}_j(v) \hat{h}(2^j v)$$

[0419] The cut-off frequency is reduced by a factor 2 at each step, allowing a reduction of the number of samples by this factor.

[0420] The wavelet coefficients at the scale $j+1$ are:

$$w_{j+1}(k) = \langle f(x), 2^{-(j+1)} \psi(2^{-(j+1)} x - k) \rangle$$

[0421] and they can be computed directly from $c_j(k)$ by:

$$\hat{w}_{j+1}(v) = \hat{c}_j(v) \hat{g}(2^j v)$$

[0422] where g is the following discrete filter:

$$\hat{g}(v) = \begin{cases} \frac{\hat{\psi}(2v)}{\hat{\phi}(v)} & \text{if } |v| < v_c \\ 1 & \text{if } v_c \leq |v| < \frac{1}{2} \end{cases}$$

and

$$\forall v: \forall n \hat{g}(v+n) = \hat{g}(v)$$

[0423] The frequency band is also reduced by a factor 2 at each step. Applying the sampling theorem, we can build a pyramid of

$$N + \frac{N}{2} + \dots + 1 = 2N$$

elements. For an image analysis the number of elements is

$$\frac{4}{3} N^2.$$

The overdetermination is not very high.

[0424] The B-spline functions are compact in this direct space. They correspond to the autoconvolution of a square function. In the Fourier space we have:

$$\hat{B}_l(v) = \frac{\sin \pi v^{l+1}}{\pi v}$$

[0425] $B_3(x)$ is a set of 4 polynomials of degree 3. We choose the scaling function $\phi(v)$ which has a $B_3(x)$ profile in the Fourier space:

$$\hat{\phi}(v) = \frac{3}{2} B_3(4v)$$

[0426] In the direct space we get:

$$\phi(x) = \frac{3}{8} \left[\frac{\sin \frac{\pi x}{4}}{\frac{\pi x}{4}} \right]^4$$

[0427] This function is quite similar to a Gaussian one and converges rapidly to 0. For 2-D the scaling function is defined by

$$\hat{\phi}(u, v) = \frac{3}{2} B_3(4r),$$

with $r = \sqrt{u^2 + v^2}$. It is an isotropic function.

[0428] The wavelet transform algorithm with n_p scales is the following one:

[0429] 1. We start with a B3-Spline scaling function and we derive ψ , h and g numerically.

[0430] 2. We compute the corresponding image FFT. We name T_0 the resulting complex array;

[0431] 3. We set j to 0. We iterate:

[0432] 4. We multiply T_j by $\hat{g}(2^j u, 2^j v)$. We get the complex array W_{j+1} . The inverse FFT gives the wavelet coefficients at the scale 2^j ;

[0433] 5. We multiply T_j by $\hat{h}(2^j u, 2^j v)$. We get the array T_{j+1} . Its inverse FFT gives the image at the scale 2^{j+1} . The frequency band is reduced by a factor 2.

[0434] 6. We increment j

[0435] 7. If $j \leq n_p$, we go back to 4.

[0436] 8. The set $\{w_1, w_2, \dots, w_{n_p}, c_{n_p}\}$ describes the wavelet transform.

[0437] If the wavelet is the difference between two resolutions, we have:

$$\hat{\psi}(2v) = \hat{\phi}(v) - \hat{\phi}(2v)$$

and:

$$\hat{g}(v) = 1 - \hat{h}(v)$$

[0438] then the wavelet coefficients $\hat{w}_j(v)$ can be computed by $\hat{c}_{j-1}(v) - \hat{c}_j(v)$.

[0439] The Reconstruction

[0440] If the wavelet is the difference between two resolutions, an evident reconstruction for a wavelet transform $W = \{w_1, w_2, \dots, w_{n_p}, c_{n_p}\}$ is:

$$\hat{c}_0(v) = \hat{c}_{n_p}(v) + \sum_j \hat{w}_j(v)$$

[0441] But this is a particular case and other wavelet functions can be chosen. The reconstruction can be done step by step, starting from the lowest resolution. At each scale, we have the relations:

$$\hat{c}_{j+1} = \hat{h}(2^j v) \hat{c}_j(v)$$

$$\hat{w}_{j+1} = \hat{g}(2^j v) \hat{c}_j(v)$$

[0442] we look for c_j knowing c_{j+1} , w_{j+1} , h and g . We restore $\hat{c}_j(v)$ with a least mean square estimator:

$$\hat{p}_h(2^j v) |\hat{c}_{j+1}(v) - \hat{h}(2^j v) \hat{c}_j(v)|^2 + \hat{p}_g(2^j v) |\hat{w}_{j+1}(v) - \hat{g}(2^j v) \hat{c}_j(v)|^2$$

[0443] is minimum. $\hat{p}_h(v)$ and $\hat{p}_g(v)$ are weight functions which permit a general solution to the restoration of $\hat{c}_j(v)$. By $\hat{c}_j(v)$ derivation we get:

$$\hat{c}_j(v) = \hat{c}_{j+1}(v) \hat{h}(2^j v) + \hat{w}_{j+1}(v) \hat{g}(2^j v)$$

[0444] where the conjugate filters have the expression:

$$\hat{h}(v) = \frac{\hat{p}_h(v) \hat{h}^*(v)}{\hat{p}_h(v) |\hat{h}(v)|^2 + \hat{p}_g(v) |\hat{g}(v)|^2}$$

$$\hat{g}(v) = \frac{\hat{p}_g(v) \hat{g}^*(v)}{\hat{p}_h(v) |\hat{h}(v)|^2 + \hat{p}_g(v) |\hat{g}(v)|^2}$$

[0445] It is easy to see that these filters satisfy the exact reconstruction equation. In fact, above pair of equations give the general solution to this equation. In this analysis, the Shannon sampling condition is always respected. No aliasing exists, so that the dealiasing condition is not necessary (i.e., it is satisfied as a matter of course).

[0446] The denominator is reduced if we choose:

$$\hat{g}(v) = \sqrt{1 - |\hat{h}(v)|^2}$$

[0447] This corresponds to the case where the wavelet is the difference between the square of two resolutions:

$$|\hat{\psi}(2v)|^2 = |\hat{\phi}(v)|^2 - |\hat{\phi}(2v)|^2$$

[0448] The reconstruction algorithm is:

[0449] 1. We compute the FFT of the image at the low resolution.

[0450] 2. We set j to n_p . We iterate:

[0451] 3. We compute the FFT of the wavelet coefficients at the scale j .

[0452] 4. We multiply the wavelet coefficients $\hat{w}_j$ by $\hat{g}$.

[0453] 5. We multiply the image at the lower resolution $\hat{c}_j$ by $\hat{h}$.

[0454] 6. The inverse Fourier Transform of the addition of $\hat{w}_j \hat{g}$ and $\hat{c}_j \hat{h}$ gives the image c_{j+1} .

[0455] 7. $j=j-1$ and we go back to 3.

[0456] The use of a scaling function with a cut-off frequency allows a reduction of sampling at each scale, and limits the computing time and the memory size.

[0457] Thus, it is seen that the DWT is in many respects comparable to the DFT, and, where convenient, may be employed in place thereof. While substantial work has been done in the application of wavelet analysis and filtering to image data, it is noted that the wavelet transform analysis is not so limited. In particular, one embodiment of the present invention applies the transform to describe statistical events represented within a multidimensional data-space. By understanding the multi-resolution interrelationships of various

events and probabilities of events, in a time-space representation, a higher level analysis is possible than with other common techniques. Likewise, because aspects of the analysis are relatively content dependent, they may be accelerated by digital signal processing techniques or array processors, without need to apply artificial intelligence. On the other hand, the transformed (and possibly filtered) data set, is advantageously suitable for intelligent analysis, either by machine or human.

[0458] Generally, there will be no need to perform an inverse transform on the data set. On the other hand, the wavelet analysis may be useful for characterizing and analyzing only a limited range of events. Advantageously, if an event is recognized with high reliability within a transform domain, the event may be extracted from the data representation and an inverse transform performed to provide the data set absent the recognized feature or event. This allows a number of different feature-specific transforms to be conducted, and analyzed. This analysis may be in series, that is, having a defined sequence of transforms, feature extractions, and inverse transforms. On the other hand, the process may be performed in parallel. That is, the data set is subjected to various "tests", which are conducted by optimally transforming the data to determine if a particular feature (event) is present, determined with high reliability. As each feature is identified, the base data set may be updated for the remaining "tests", which will likely simplify the respective analysis, or improve the reliability of the respective determination. As each event or feature is extracted, the data set becomes simpler and simpler, until only noise remains.

[0459] It should be noted that, in some instances, a high reliability determination of the existence of an event cannot be concluded. In those cases, it is also possible to perform a contingent analysis, leading to a plurality of possible results for each contingency. Thus, a putative feature is extracted or not extracted from the data set and both results passed on for further analysis. Where one of the contingencies is inconsistent with a subsequent high reliability determination, that entire branch of analysis may be truncated. Ideally, the output consists of a data representation with probabilistic representation of the existence of events or features represented within the data set. As discussed below, this may form the basis for a risk-reliability output space representation of the data, useable directly by a human (typically in the form of a visual output) and/or for further automated analysis.

[0460] It is also noted that the data set is not temporally static, and therefore the analysis may be conducted in real time based on a stream of data.

[0461] The Process to be Estimated

[0462] The Kalman filter addresses the general problem of trying to estimate the state $x \in \mathfrak{R}^n$ of a discrete-time controlled process that is governed by the linear stochastic difference equation

$$x_k = Ax_{k-1} + Bu_k + w_{k-1}, \quad (3.1)$$

[0463] with a measurement $z \in \mathfrak{R}^n$ that is

$$z_k = Hx_k + v_k. \quad (3.2)$$

[0464] The random variables w_k and v_k represent the process and measurement noise (respectively). They are assumed to be independent (of each other), white, and with normal probability distributions

$$p(w) = N(0, Q), \quad (3.3)$$

$$p(v) = N(0, R). \quad (3.4)$$

[0465] In practice, the process noise covariance Q and measurement noise covariance R matrices might change with each time step or measurement, however here we assume they are constant.

[0466] Kalman, Rudolph, Emil, “New Approach to Linear Filtering and Prediction Problems”, Transactions of the ASME—Journal of Basic Engineering, 82D:35-45 (1960) (describes the namesake Kalman filter, which is a set of mathematical equations that provides an efficient computational (recursive) solution of the least-squares method. The filter is very powerful in several aspects: it supports estimations of past, present, and even future states, and it can do so even when the precise nature of the modeled system is unknown.)

[0467] The $n \times n$ matrix A in the difference equation (3.1) relates the state at the previous time step $k-1$ to the state at the current step k , in the absence of either a driving function or process noise. Note that in practice A might change with each time step, but here we assume it is constant. The $n \times 1$ matrix B relates the optional control input $k \in \mathfrak{R}^1$ to the state x . The $m \times n$ matrix H in the measurement equation (3.2) relates the state to the measurement z_k . In practice H might change with each time step or measurement, but here we assume it is constant.

[0468] The Computational Origins of the Filter

[0469] We define $\hat{x}_k^- \in \mathfrak{R}^n$ (note the “super minus”) to be our a priori state estimate at step k given knowledge of the process prior to step k , and $\hat{x}_k \in \mathfrak{R}^n$ to be our a posteriori state estimate at step k given measurement z_k . We can then define a priori and a posteriori estimate errors as

$$e_k^- \equiv x_k - \hat{x}_k^-, \text{ and}$$

$$e_k \equiv x_k - \hat{x}_k.$$

[0470] The a priori estimate error covariance is then

$$P_k^- = E[e_k^- e_k^{-T}], \quad (3.5)$$

[0471] and the a posteriori estimate error covariance is

$$P_k = E[e_k e_k^T]. \quad (3.6)$$

[0472] In deriving the equations for the Kalman filter, we begin with the goal of finding an equation that computes an a posteriori state estimate $\hat{x}_k$ as a linear combination of an a priori estimate $\hat{x}_k^-$ and a weighted difference between an actual measurement z_k and a measurement prediction $H\hat{x}_k^-$ as shown below in (3.7). Some justification for (3.7) is given in “The Probabilistic Origins of the Filter” found below. See, http://www.cs.unc.edu/~welch/kalman/kalman_filter/kalman-1.htm, expressly incorporated herein by reference.

$$\hat{x}_k = \hat{x}_k^- + K(z_k - H\hat{x}_k^-) \quad (3.7)$$

[0473] The difference $(z_k - H\hat{x}_k^-)$ in (3.7) is called the measurement innovation, or the residual. The residual reflects the discrepancy between the predicted measurement $H\hat{x}_k^-$ and the actual measurement z_k . A residual of zero means that the two are in complete agreement.

[0474] The $n \times m$ matrix K in (3.7) is chosen to be the gain or blending factor that minimizes the a posteriori error covariance (3.6). This minimization can be accomplished by first substituting (3.7) into the above definition for e_k , substituting that into (3.6), performing the indicated expectations, taking the derivative of the trace of the result with respect to K , setting that result equal to zero, and then solving for K . For more details see [Maybeck79; Brown92; Jacobs93]. One form of the resulting K that minimizes (3.6) is given by

$$K_k = P_k^- H^T (H P_k^- H^T + R)^{-1} \quad (3.8)$$

$$= \frac{P_k^- H^T}{H P_k^- H^T + R}.$$

[0475] Looking at (3.8) we see that as the measurement error covariance R approaches zero, the gain K weights the residual more heavily. Specifically,

$$\lim_{R \rightarrow 0} K_k = H^{-1}.$$

[0476] On the other hand, as the a priori estimate error covariance P_k^- approaches zero, the gain K weights the residual less heavily. Specifically,

$$\lim_{P_k^- \rightarrow 0} K_k = 0.$$

[0477] Another way of thinking about the weighting by K is that as the measurement error covariance R approaches zero, the actual measurement z_k is “trusted” more and more, while the predicted measurement $H\hat{x}_k^-$ is trusted less and less. On the other hand, as the a priori estimate error covariance P_k^- approaches zero the actual measurement z_k is trusted less and less, while the predicted measurement $H\hat{x}_k^-$ is trusted more and more.

[0478] The Probabilistic Origins of the Filter

[0479] The justification for (3.7) is rooted in the probability of the a priori estimate $\hat{x}_k^-$ conditioned on all prior measurements z_k (Bayes’ rule). For now let it suffice to point out that the Kalman filter maintains the first two moments of the state distribution,

$$E[x_k] = \hat{x}_k$$

$$E[(x_k - \hat{x}_k)(x_k - \hat{x}_k)^T] = P_k$$

[0480] The a posteriori state estimate (3.7) reflects the mean (the first moment) of the state distribution—it is normally distributed if the conditions of (3.3) and (3.4) are met. The a posteriori estimate error covariance (3.6) reflects the variance of the state distribution (the second non-central moment). In other words,

$$p(x_k | z_k) = N(E[x_k], E[(x_k - \hat{x}_k)(x_k - \hat{x}_k)^T]) = N(\hat{x}_k, P_k).$$

[0481] For more details on the probabilistic origins of the Kalman filter, see [Maybeck79; Brown92; Jacobs93].

[0482] The Discrete Kalman Filter Algorithm

[0483] The Kalman filter estimates a process by using a form of feedback control: the filter estimates the process state at some time and then obtains feedback in the form of (noisy) measurements. As such, the equations for the Kalman filter fall into two groups: time update equations and measurement update equations. The time update equations are responsible for projecting forward (in time) the current state and error covariance estimates to obtain the a priori estimates for the next time step. The measurement update equations are

responsible for the feedback—i.e. for incorporating a new measurement into the a priori estimate to obtain an improved a posteriori estimate.

[0484] The time update equations can also be thought of as predictor equations, while the measurement update equations can be thought of as corrector equations. Indeed the final estimation algorithm resembles that of a predictor-corrector algorithm for solving numerical problems as shown below in FIG. 5, which shows the ongoing discrete Kalman filter cycle. The time update projects the current state estimate ahead in time. The measurement update adjusts the projected estimate by an actual measurement at that time.

[0485] The specific equations for the time and measurement updates are presented below:

Discrete Kalman Filter Time Update Equations

[0486]

$$\hat{x}_k^- = A\hat{x}_{k-1} + Bu_k \quad (3.9)$$

$$P_k^- = AP_{k-1}A^T + Q \quad (3.10)$$

[0487] Again notice how the time update equations (3.9) and (3.10) project the state and covariance estimates forward from time step $k-1$ to step k . A and B are from (3.1), while Q is from (3.3). Initial conditions for the filter are discussed in the earlier references.

Discrete Kalman Filter Measurement Update Equations

[0488]

$$K_k = P_k^- H^T (HP_k^- H^T + R)^{-1} \quad (3.11)$$

$$\hat{x}_k = \hat{x}_k^- + K_k(z_k - H\hat{x}_k^-) \quad (3.12)$$

$$P_k = (I - K_k H)P_k^- \quad (3.13)$$

[0489] The first task during the measurement update is to compute the Kalman gain, K_k . Notice that the equation given here as (3.11) is the same as (3.8). The next step is to actually measure the process to obtain z_k , and then to generate an a posteriori state estimate by incorporating the measurement as in (3.12). Again (3.12) is simply (3.7) repeated here for completeness. The final step is to obtain an a posteriori error covariance estimate via (3.13). All of the Kalman filter equations can be algebraically manipulated into several forms. Equation (3.8) represents the Kalman gain in one popular form.

[0490] After each time and measurement update pair, the process is repeated with the previous a posteriori estimates used to project or predict the new a priori estimates. This recursive nature is one of the very appealing features of the Kalman filter—it makes practical implementations much more feasible than (for example) an implementation of a Wiener filter [Brown92] which is designed to operate on all of the data directly for each estimate. The Kalman filter instead recursively conditions the current estimate on all of the past measurements. FIG. 6 offers a complete picture of the operation of the filter, combining the high-level diagram of FIG. 5 with the equations (3.9) to (3.13).

[0491] Filter Parameters and Tuning

[0492] In the actual implementation of the filter, the measurement noise covariance R is usually measured prior to operation of the filter. Measuring the measurement error covariance R is generally practical (possible) because we need to be able to measure the process anyway (while operating the filter) so we should generally be able to take some

off-line sample measurements in order to determine the variance of the measurement noise.

[0493] The determination of the process noise covariance Q is generally more difficult as we typically do not have the ability to directly observe the process we are estimating. Sometimes a relatively simple (poor) process model can produce acceptable results if one “injects” enough uncertainty into the process via the selection of Q . Certainly in this case one would hope that the process measurements are reliable.

[0494] In either case, whether or not we have a rational basis for choosing the parameters, often times superior filter performance (statistically speaking) can be obtained by tuning the filter parameters Q and R . The tuning is usually performed off-line, frequently with the help of another (distinct) Kalman filter in a process generally referred to as system identification.

[0495] Under conditions where Q and R are in fact constant, both the estimation error covariance P_k and the Kalman gain K_k will stabilize quickly and then remain constant (see the filter update equations in FIG. 6). If this is the case, these parameters can be pre-computed by either running the filter off-line, or for example by determining the steady-state value of P_k as described in [Grewal93].

[0496] It is frequently the case however that the measurement error (in particular) does not remain constant. For example, observing like transmitters, the noise in measurements of nearby transmitters will generally be smaller than that in far-away transmitters. Also, the process noise Q is sometimes changed dynamically during filter operation—becoming Q_k —in order to adjust to different dynamics. For example, in the case of tracking the head of a user of a 3D virtual environment we might reduce the magnitude of Q_k if the user seems to be moving slowly, and increase the magnitude if the dynamics start changing rapidly. In such cases Q_k might be chosen to account for both uncertainty about the user’s intentions and uncertainty in the model.

[0497] 2 The Extended Kalman Filter (EKF)

[0498] The Process to be Estimated

[0499] As described above, the Kalman filter addresses the general problem of trying to estimate the state $x \in \mathfrak{R}^n$ of a discrete-time controlled process that is governed by a linear stochastic difference equation. But what happens if the process to be estimated and (or) the measurement relationship to the process is non-linear? Some of the most interesting and successful applications of Kalman filtering have been such situations. A Kalman filter that linearizes about the current mean and covariance is referred to as an extended Kalman filter or EKF.

[0500] In something akin to a Taylor series, we can linearize the estimation around the current estimate using the partial derivatives of the process and measurement functions to compute estimates even in the face of non-linear relationships. To do so, we must begin by modifying some of the analysis presented above. Let us assume that our process again has a state vector $x \in \mathfrak{R}^n$, but that the process is now governed by the non-linear stochastic difference equation

$$x_k = f(x_{k-1}, u_k, w_{k-1}), \quad (4.1)$$

[0501] with a measurement $z \in \mathfrak{R}^m$ that is

$$z_k = h(x_k, v_k), \quad (4.2)$$

[0502] where the random variables w_k and v_k again represent the process and measurement noise as in (4.3) and (4.4). In this case the non-linear function f in the difference equation (4.1) relates the state at the previous time step $k-1$ to the state at the current time step k . It includes as parameters any driving function v_k and the zero-mean process noise w_k . The non-linear function h in the measurement equation (4.2)

relates the state x_k to the measurement z_k . See, http://www.cs.unc.edu/~welch/kalman/kalman_filter/kalman-2.html, expressly incorporated herein by reference.

[0503] In practice of course one does not know the individual values of the noise w_k and v_k at each time step. However, one can approximate the state and measurement vector without them as $\bar{x}_k = f(\hat{x}_{k-1}, u_k, 0)$ (4.3) and $\bar{z}_k = h(\bar{x}_k, 0)$, (4.4) where $\hat{x}_k$ is some a posteriori estimate of the state (from a previous time step k).

[0504] It is important to note that a fundamental flaw of the EKF is that the distributions (or densities in the continuous case) of the various random variables are no longer normal after undergoing their respective nonlinear transformations. The EKF is simply an ad hoc state estimator that only approximates the optimality of Bayes' rule by linearization. Some interesting work has been done by Julier et al. in developing a variation to the EKF, using methods that preserve the normal distributions throughout the non-linear transformations [Julier96].

[0505] The Computational Origins of the Filter

[0506] To estimate a process with non-linear difference and measurement relationships, we begin by writing new governing equations that linearize an estimate about (4.3) and (4.4),

$$x_k = \bar{x}_k + A(x_{k-1} - \hat{x}_{k-1}) + w_k, \quad (4.5)$$

$$z_k = \bar{z}_k + H(x_k - \bar{x}_k) + v_k, \quad (4.6)$$

[0507] where

[0508] x_k and z_k are the actual state and measurement vectors,

[0509] $\bar{x}_k$ and $\bar{z}_k$ are the approximate state and measurement vectors from (4.3) and (4.4),

[0510] $\hat{x}_k$ is an a posteriori estimate of the state at step k ,

[0511] the random variables w_k and v_k represent the process and measurement noise as in (3.3) and (4.4).

[0512] A is the Jacobian matrix of partial derivatives of f with respect to x , that is

$$A_{[s,j]} = \frac{\partial f_{[s]}}{\partial x_{[j]}}(\hat{x}_{k-1}, u_k, 0),$$

[0513] W is the Jacobian matrix of partial derivatives of f with respect to w ,

$$W_{[i,j]} = \frac{\partial f_{[i]}}{\partial w_{[j]}}(\hat{x}_{k-1}, u_k, 0),$$

[0514] H is the Jacobian matrix of partial derivatives of h with respect to x ,

$$H_{[i,j]} = \frac{\partial h_{[i]}}{\partial x_{[j]}}(\bar{x}_k, 0),$$

[0515] V is the Jacobian matrix of partial derivatives of h with respect to v ,

$$V_{[i,j]} = \frac{\partial h_{[i]}}{\partial v_{[j]}}(\bar{x}_k, 0).$$

[0516] Note that for simplicity in the notation we do not use the time step subscript k with the Jacobians A , W , H , and V , even though they are in fact different at each time step.

[0517] Now we define a new notation for the prediction error,

$$\bar{e}_{jk} = x_k - \bar{x}_k, \quad (4.7)$$

[0518] and the measurement residual,

$$\bar{e}_k = z_k - \bar{z}_k. \quad (4.8)$$

[0519] Remember that in practice one does not have access to x_k in (4.7), it is the actual state vector, i.e. the quantity one is trying to estimate. On the other hand, one does have access to z_k in (4.8), it is the actual measurement that one is using to estimate x_k . Using (4.7) and (4.8) we can write governing equations for an error process as

$$\bar{e}_k = A(x_{k-1} - \hat{x}_{k-1}) + \epsilon_k, \quad (4.9)$$

$$\bar{e}_k = H\bar{e}_k + \eta_k, \quad (4.10)$$

[0520] where ϵ_k and η_k represent new independent random variables having zero mean and covariance matrices WQW^T and VRV^T , with Q and R as in (3.3) and (3.4) respectively.

[0521] Notice that the equations (4.9) and (4.10) are linear, and that they closely resemble the difference and measurement equations (3.1) and (3.2) from the discrete Kalman filter. This motivates us to use the actual measurement residual $\bar{e}_k$ in (4.8) and a second (hypothetical) Kalman filter to estimate the prediction error $\bar{e}_k$ given by (4.9). This estimate, call it $\hat{e}_k$, could then be used along with (4.7) to obtain the a posteriori state estimates for the original non-linear process as

$$\hat{x}_k = \bar{x}_k + \hat{e}_k. \quad (4.11)$$

[0522] The random variables of (4.9) and (4.10) have approximately the following probability distributions (see the previous footnote):

$$p(\bar{e}_k) = N(0, E[\bar{e}_k \bar{e}_k^T])$$

$$p(\epsilon_k) = N(0, WQW^T)$$

$$p(\eta_k) = N(0, VRV^T)$$

[0523] Given these approximations and letting the predicted value of $\bar{e}_k$ be zero, the Kalman filter equation used to estimate $\hat{e}_k$ is

$$\hat{e}_k = K_k \bar{e}_k. \quad (4.12)$$

[0524] By substituting (4.12) back into (4.11) and making use of (4.8) we see that we do not actually need the second (hypothetical) Kalman filter:

$$\begin{aligned} \hat{x}_k &= \bar{x}_k + K_k \textcircled{?} \\ &= \bar{x}_k + K_k (z_k - \bar{z}_k) \end{aligned} \quad (4.13)$$

⓪ indicates text missing or illegible when filed

[0525] Equation (4.13) can now be used for the measurement update in the extended Kalman filter, with $\bar{x}_k$ and $\bar{z}_k$ coming from (4.3) and (4.4), and the Kalman gain K_k coming from (3.11) with the appropriate substitution for the measurement error covariance.

[0526] The complete set of EKF equations is shown below. Note that we have substituted $\hat{x}_k^-$ for $\bar{x}_k$ to remain consistent with the earlier "super minus" a priori notation, and that we

now attach the subscript k to the Jacobians A, W, H, and V, to reinforce the notion that they are different at (and therefore must be recomputed at) each time step.

EKF Time Update Equations

[0527]

$$\hat{x}_k^- = f(\hat{x}_{k-1}, u_k, 0) \quad (4.14)$$

$$P_k^- = A_k P_{k-1} A_k^T + W_k Q_{k-1} W_k^T \quad (4.15)$$

[0528] As with the basic discrete Kalman filter, the time update equations (4.14) and (4.15) project the state and covariance estimates from the previous time step k-1 to the current time step k. Again f in (4.14) comes from (4.3), A_k and W_k are the process Jacobians at step k, and Q_k is the process noise covariance (3.3) at step k.

EKF Measurement Update Equations

[0529]

$$K_k = P_k^- H_k^T (H_k P_k^- H_k^T + V_k R_k V_k^T)^{-1} \quad (4.16)$$

$$\hat{x}_k = \hat{x}_k^- + K_k (z_k - h(\hat{x}_k^-, 0)) \quad (4.17)$$

$$P_k = (I - K_k H_k) P_k^- \quad (4.18)$$

[0530] As with the basic discrete Kalman filter, the measurement update equations (4.16), (4.17) and (4.18) correct the state and covariance estimates with the measurement z_k . Again h in (4.17) comes from (3.4), H_k and V are the measurement Jacobians at step k, and R_k is the measurement noise covariance (3.4) at step k. (Note we now subscript R allowing it to change with each measurement.)

[0531] The basic operation of the EKF is the same as the linear discrete Kalman filter as shown in FIG. 5. FIG. 7 offers a complete picture of the operation of the EKF, combining the high-level diagram of FIG. 5 with the equations (4.14) through (4.18).

[0532] An important feature of the EKF is that the Jacobian H_k in the equation for the Kalman gain K_k serves to correctly propagate or “magnify” only the relevant component of the measurement information. For example, if there is not a one-to-one mapping between the measurement z_k and the state via h, the Jacobian H_k affects the Kalman gain so that it only magnifies the portion of the residual $z_k - h(\hat{x}_k^-, 0)$ that does affect the state. Of course if over all measurements there is not a one-to-one mapping between the measurement z_k and the state via h, then as you might expect the filter will quickly diverge. In this case the process is unobservable.

[0533] The Process Model

[0534] In a simple example we attempt to estimate a scalar random constant, a voltage for example. Let’s assume that we have the ability to take measurements of the constant, but that the measurements are corrupted by a 0.1 volt RMS white measurement noise (e.g. our analog to digital converter is not very accurate). In this example, our process is governed by the linear difference equation

$$x_k = A x_{k-1} + B u_k + w_k$$

$$= x_{k-1} + w_k,$$

[0535] with a measurement $z \in \mathfrak{R}^1$ that is

$$z_k = H x_k + v_k$$

$$= x_k + v_k.$$

[0536] The state does not change from step to step so $A=1$. There is no control input so $u=0$. Our noisy measurement is of the state directly so $H=1$. (Notice that we dropped the subscript k in several places because the respective parameters remain constant in our simple model.)

[0537] The Filter Equations and Parameters

[0538] Our time update equations are $\hat{x}_k^- = \hat{x}_{k-1}$, $P_k^- = P_{k-1} + Q$,

[0539] our measurement update equations are

$$K_k = P_k^- (P_k^- + R)^{-1} \quad (5.1)$$

$$= \frac{P_k^-}{P_k^- + R}, \quad \hat{x}_k = \hat{x}_k^- + K_k (z_k - \hat{x}_k^-), \quad P_k = (1 - K_k) P_k^-.$$

[0540] Presuming a very small process variance, we let $Q=1e-5$. (We could certainly let $Q=0$ but assuming a small but non-zero value gives us more flexibility in “tuning” the filter as we will demonstrate below.) Let’s assume that from experience we know that the true value of the random constant has a standard normal probability distribution, so we will “seed” our filter with the guess that the constant is 0. In other words, before starting we let $\hat{x}_{k-1}=0$.

[0541] Similarly we need to choose an initial value for P_{k-1} , call it P_0 . If we were absolutely certain that our initial state estimate $\hat{x}_0=0$ was correct, we would let $P_0=0$. However given the uncertainty in our initial estimate $\hat{x}_0$, choosing $P_0=0$ would cause the filter to initially and always believe $\hat{x}_k=0$. As it turns out, the alternative choice is not critical. We could choose almost any $P_0 \neq 0$ and the filter would eventually converge. It is convenient, for example, to start with $P_0=1$.

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5,416,318; 5,422,565; 5,432,904; 5,440,428; 5,442,553; 5,450,321; 5,450,329; 5,450,613; 5,475,399; 5,479,482; 5,483,632; 5,486,840; 5,493,658; 5,494,097; 5,497,271; 5,497,339; 5,504,622; 5,506,595; 5,511,724; 5,519,403; 5,519,410; 5,523,559; 5,525,977; 5,528,248; 5,528,496; 5,534,888; 5,539,869; 5,547,125; 5,553,661; 5,555,172; 5,555,286; 5,555,502; 5,559,520; 5,572,204; 5,576,724; 5,579,535; 5,627,547; 5,638,305; 5,648,769; 5,650,929; 5,653,386; 5,654,715; 5,666,102; 5,670,953; 5,689,252; 5,691,695; 5,702,165; 5,712,625; 5,712,640; 5,714,852; 5,717,387; 5,732,368; 5,734,973; 5,742,226; 5,752,754; 5,758,311; 5,777,394; 5,781,872; 5,919,239; 6,002,326; 6,013,956; 6,078,853; 6,104,101; and 6,449,535.

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[0594] One embodiment of the present invention advances the art by explicitly communicating reliability or risk information to the user. Therefore, in addition to communicating an event or predicted event, the system also computes or determines a reliability of the information and outputs this information. The reliability referred to herein generally is unavailable to the original detection device, though such device may generate its own reliability information for a sensor reading.

[0595] Therefore, the user interface according to this embodiment is improved by outputting information relating to both the event and a reliability or risk with respect to that information.

[0596] According to a preferred embodiment of the invention, a vehicle travel information system is provided, for example integrated with a vehicular navigation system. In a symmetric peer-to-peer model, each vehicle includes both environmental event sensors and a user interface, but the present invention is not dependent on both aspects being present in a device. As the vehicle travels, and as time advances, its context sphere is altered. For any context sphere, certain events or sensed conditions will be most relevant. These most relevant events or sensed, to the extent known by the system, are then output through a user interface. However, often, the nature or existence of relevant or potentially relevant event is unreliable, or reliance thereon entails risk.

[0597] In the case of a vehicle traveling along a roadway, there are two particular risks to analyze: first, that the recorded event may not exist (false positive), and second, that an absence of indication of an event is in error (false negative). For example, the degree of risk may be indicated by an indication of color (e.g., red, yellow green) or magnitude (e.g., a bar graph or dial).

[0598] In many cases, the degree of risk is calculable, and thus may be readily available. For example, if the event sensor is a detection of police radar, reliability may be inferred from a time since last recording of an event. If a car is traveling along a highway, and receives a warning of traffic enforcement radar from a car one mile ahead, there is a high degree of certainty that the traffic enforcement radar will actually exist

as the vehicle proceeds along the highway. Further, if the traffic radar is in fixed location, there is a high degree of certainty that there is no traffic enforcement radar closer than one mile. On the other hand, if a warning of traffic radar at a given location is two hours old, then the risk of reliance on this information is high, and the warning should be deemed general and advisory of the nature of risks in the region. Preferably, as such a warning ages, the temporal proximity of the warning is spread from its original focus.

[0599] On the contrary, if the warning relates to a pothole in a certain lane on the highway, the temporal range of risk is much broader: even a week later, the reliability of the continued existence at that location remains high. However, over the course of a year, the reliability wanes. On the other hand, while there may be a risk of other potholes nearby, the particular detected pothole would not normally move.

[0600] The algorithm may also be more complex. For example, if a traffic accident occurs at a particular location, there are generally acceptable predictions of the effect of the accident on road traffic for many hours thereafter. These include rubbernecking, migrations of the traffic pattern, and secondary accidents. These considerations may be programmed, and the set of events and datapoints used to predict spatial and temporal effects, as well as the reliability of the existence of such effects. This, in turn, may be used to advise a traveler to take a certain route to a destination.

[0601] Eventually, the reliability of the information is inferred to be so low as to cause an expiration of the event, although preferably a statistical database is maintained to indicate geographic regional issues broadly.

[0602] Therefore, the system and method according to the present invention provides an output that can be considered "two dimensional" (or higher dimensional); the nature of the warning, and the reliability of the warning. In conjunction, the system may therefore output a reliability of an absence of warning. In order to conserve communications bandwidth, it is preferred that an absence of warning is inferred from the existence of a communications channel with a counterpart, along with a failure of a detection of an event triggering a warning. Alternately, such communications may be explicit.

[0603] The present invention can provide a mobile warning system having a user interface for conveying an event warning and an associated reliability or risk of reliance on the warning.

[0604] Preferably, the reliability or risk of reliance is assessed based on a time between original sensing and proximity. The reliability may also be based on the nature of the event or sensed condition. An intrinsic reliability of the original sensed event or condition may also be relayed, as distinct from the reliability or risk of reliance assuming the event or condition to have been accurately sensed.

[0605] In order to determine risk, often statistical and probabilistic techniques may be used. Alternately, non-linear techniques, such as neural networks, may be employed. In employing a probabilistic scheme, a sensor reading at time zero, and the associated intrinsic probability of error are stored. A model is associated with the sensor reading to determine a decay pattern. Thus, in the case of traffic enforcement radar, the half-life for a "radar trap" for K band radar being fixed in one location is, for example, about 5 minutes. Thereafter, the enforcement officer may give a ticket, and proceed up the road. Thus, for times less than three minutes, the probability of the traffic enforcement radar remaining in fixed position is high. For this same time-period, the prob-

ability that the traffic enforcement officer has moved up the road against the direction of traffic flow is low. A car following 3 miles behind a reliable sensor at 60 mph would therefore have a highly reliable indication of prospective conditions. As the time increases, so does the risk; a car following ten miles behind a sensor would only have a general warning of hazards, and a general indication of the lack thereof. However, over time, a general (and possibly diurnal or other cyclic time-sensitive variation) risk of travel within a region may be established, to provide a baseline.

[0606] It is noted that the risks are not limited to traffic enforcement radar or laser. Rather, the scheme according to the present invention is generalized to all sorts of risks. For example, a sensor may detect or predict sun glare. In this case, a model would be quite accurate for determining changes over time, and assuming a reliable model is employed, this condition could generally be accurately predicted.

[0607] Another example is road flooding. This may be detected, for example, through the use of optical sensors, tire drag sensors, “splash” sensors, or other known sensors. In this case, the relevant time-constant for onset and decay will be variable, although for a given location, the dynamics may be modeled with some accuracy, based on sensed actual conditions, regional rainfall, ground saturation, and particular storm pattern. Therefore, a puddle or hydroplaning risk may be communicated to the driver in terms of location, likely magnitude, and confidence.

[0608] It is noted that these three independent parameters need not all be conveyed to the user. For example, the geographic proximity to an event location may be used to trigger an output. Therefore, no independent output of location may be necessary in this case. In some cases, the magnitude of the threat is relevant, in other cases it is not. In many present systems (e.g., radar detection), threat magnitude is used as a surrogate for risk. However, it is well understood that there are high magnitude artifacts, and low magnitude true threats, and thus this paradigm has limited basis for use. The use of risk or confidence as an independent factor may be express or intermediate. Thus, a confidence threshold may be internally applied before communicating an event to the user. In determining or predicting risk or confidence, it may be preferred to provide a central database. Therefore, generally more complex models may be employed, supported by a richer data set derived from many measurements over an extended period of time. The central database may either directly perform the necessary computations, or convey an appropriate model, preferably limited to the context (e.g., geography, time, general environmental conditions), for local calculation of risk.

[0609] The incorporated references relate, for example, to methods and apparatus which may be used as part of, or in conjunction with the present invention. Therefore, it is understood that the present invention may integrate other systems, or be integrated in other systems, having complementary, synergistic or related in some way. For example, common sensors, antennas, processors, memory, communications hardware, subsystems and the like may provide a basis for combination, even if the functions are separate.

[0610] The techniques according to the present invention may be applied to other circumstances. Therefore, it is understood that the present invention has, as an object to provide a user interface harnessing the power of statistical methods. Therefore, it is seen that, as an aspect of the present invention, a user interface, a method of providing a user interface, computer software for generating a human-computer interface,

and a system providing such a user interface, presents a prediction of a state as well as an indication of a statistical reliability of the prediction.

[0611] Within a vehicular environment, the statistical analysis according to the present invention may also be used to improve performance and the user interface of other systems. In particular, modern vehicles have a number of indicators and warnings. In most known systems, warnings are provided at pre-established thresholds. According to the present invention, a risk analysis may be performed on sensor and other data to provide further information for the user, e.g., an indication of the reliability of the sensor data, or the reliability under the circumstances of the sensor data as basis for decision. (For example, a temperature sensor alone does not indicate whether an engine is operating normally.)

EXAMPLE 1

[0612] The present example provides a mobile telecommunications device having a position detector, which may be absolute, relative, hybrid, or other type, and preferably a communications device for communicating information, typically location relevant information. The device may serve as a transmitter, transmitting information relevant to the location (or prior locations) of the device, a receiver, receiving information relevant to the location (or prospective location) of the device, or a composite.

[0613] In the case of a transmitter device or stand-alone device, a sensor is provided to determine a condition of or about the device or its context. This sensor may populate a map or mapping system with historical map data.

[0614] During use, a receiving device seeks to output location context-relevant information to the user, and therefore in this embodiment includes a human user interface. Typically, in a vehicle having a general linear or highly constrained type path, a position output is not a critical feature, and may be suppressed in order to simplify the interface. Rather, a relative position output is more appropriate, indicating a relative position (distance, time, etc.) with respect to a potential contextually relevant position. In addition, especially in systems where a plurality of different types of sensors or sensed parameters are available, the nature of the relevant context is also output. Further, as a particular feature of the present invention, a risk or reliability assessment is indicated to the user. This risk or reliability assessment is preferably statistically derived, although it may be derived through other known means, for example Boolean analysis, fuzzy logic, or neural networks.

[0615] For example, the device may provide weather information to the user. Through one or more of meteorological data from standard reporting infrastructure (e.g., NOAA, Accuweather®, etc.), mobile reporting nodes (e.g., mobiles devices having weather sensors), satellite data, and other weather data sources, a local weather map is created, preferably limited to contextual relevance. In most cases, this weather map is stored locally; however, if the quality of service for a communications link may be assured, a remote database system serving one or more devices may be provided. For example, a cellular data communications system may be used to communicate with the Internet or a service provider.

[0616] The mobile unit, in operation, determines its position, and, though explicit user input and/or inferential analysis, determines the itinerary or expected path of the device and time sequence. The device (or associated systems) then deter-

mines the available weather information for the route and anticipated itinerary (which may itself be dependent on the weather information and/or reaction thereto). This available information is then modeled, for example using a statistical model as described hereinabove, to predict the forthcoming weather conditions for the device or transporting vehicle.

[0617] The device then determines the anticipated conditions and relevance sorts them. In this case, both positive and negative information may be useful, i.e., a warning about bad weather, ice, freezing road surfaces, fog, sand-storms, rain, snow, sleet, hail, sun glare, etc., and an indication of dry, warm, well-illuminated road surfaces may both be useful information.

[0618] In addition, through the analysis, a number of presumptions and predictions are made, for example using a chain. Therefore, while the system may predict a most likely state of affairs, this alone does not provide sufficient information for full reliance thereon. For example, the present road surface freezing conditions thirty miles ahead on a road may be a poor indicator of the road conditions when the device is at that position. In addition to changes in the weather, human action may be taken, such as road salt, sand, traffic, etc., which would alter the conditions; especially in response to a warning. On the other hand, a report of freezing road conditions one mile ahead would generally have high predictive value for the actual road conditions when the device is at that location, assuming that the vehicle is traveling in that direction.

[0619] In many cases, there is too much raw information to effectively display to the user all relevant factors in making a reliability or risk determination. Thus, the device outputs a composite estimation of the reliability or risk, which may be a numeric or non-parametric value. This is output in conjunction with the nature of the alert and its contextual proximity.

[0620] As stated above, there will generally be a plurality of events, each with an associated risk or reliability and location. The relevance of an event may be predicted based on the dynamics of the vehicle in which the device is transported and the nature of the event. Thus, if the vehicle requires 170 feet to stop from a speed of 60 MPH, a warning which might trigger a panic stop should be issued between 170-500 feet in advance. If the warning is triggered closer than 170 feet, preferably the warning indicates that the evasive maneuver will be necessary.

[0621] In this case, the risk indicator includes a number of factors. First, there is the reliability of the data upon which the warning is based. Second, there is the reliability of the predictive model which extrapolates from, the time the raw data is acquired to the conjunction of the device and the location of the event. Third, there is an assessment of the relative risks of, responding to a false positive versus failing to respond to a false negative. Other risks may also be included in the analysis. Together, the composite risk is output, for example as a color indicator. Using, for example, a tricolor (red-green-blue) light emitting diode (LED) or bicolor LED (red-green), a range of colors may be presented to the user. Likewise, in an audio alert, the loudness or harmonic composition (e.g., harmonic distortion) of a tone or alert signal may indicate the risk or reliability. (In the case of loudness, preferably a microphone measures ambient noise to determine a minimum loudness necessary to indicate an alert).

[0622] The position detector is preferably a GPS or combined GPS-GLONASS receiver, although a network position detection system (e.g., Enhanced 911 type system) may also

be employed. Preferably, the position detector achieves an accuracy of ± 30 meters 95% of the time, and preferably provides redundant sensors, e.g., GPS and inertial sensors, in case of failure or error of one of the systems. However, for such purposes as pothole reporting, positional accuracies of 1 to 3 meters are preferred. These may be obtained through a combination of techniques, and therefore the inherent accuracy of any one technique need not meet the overall system requirement.

[0623] The position detector may also be linked to a mapping system and possibly a dead reckoning system, in order to pinpoint a position with a geographic landmark. Thus, while precise absolute coordinate measurements of position may be used, it may also be possible to obtain useful data at reduced cost by applying certain presumptions to available data. In an automotive system, steering angle, compass direction, and wheel revolution information may be available, thereby giving a rough indication of position from a known starting point. When this information is applied to a mapping system, a relatively precise position may be estimated. Therefore, the required precision of another positioning system used in conjunction need not be high, in order to provide high reliability position information. For example, where it is desired to map potholes, positional accuracy of 10 cm may be desired, far more precise than might be available from a normal GPS receiver mounted in a moving automobile. Systems having such accuracy may then be used as part of an automated repair system. However, when combined with other data, location and identification of such events is possible. Further, while the system may include or tolerate inaccuracies, it is generally desired that the system have high precision, as compensation for inaccuracies may be applied.

[0624] A typical implementation of the device provides a memory for storing events and respective locations. Preferably, further information is also stored, such as a time of the event, its character or nature, and other quantitative or qualitative aspects of the information or its source and/or conditions of acquisition. This memory may be a solid state memory or module (e.g., 64-256 MB Flash memory), rotating magnetic and/or optical memory devices, or other known types of memory.

[0625] The events to be stored may be detected locally, such as through a detector for radar and/or laser emission source, radio scanner, traffic or road conditions (mechanical vehicle sensors, visual and/or infrared imaging, radar or LIDAR analysis, acoustic sensors, or the like), places of interest which may be selectively identified, itinerary stops, and/or fixed locations. The events may also be provided by a remote transmitter, with no local event detection. Therefore, while means for identifying events having associated locations is a part of the system as a whole, such means need not be included in every apparatus embodying the invention.

[0626] Radar detectors typically are employed to detect operating emitters of X (10.5 GHz), K (25 GHz) and Ka (35 GHz) radar emissions from traffic control devices or law enforcement personnel for detecting vehicle speed by the Doppler effect. These systems typically operate as superheterodyne receivers which sweep one or more bands, and detect a wave having an energy significantly above background. As such, these types of devices are subject to numerous sources of interference, accidental, intentional, and incidental. A known system, Safety Warning System (SWS) licensed by Safety Warning System L.C., Englewood Fla., makes use of such radar detectors to specifically warn motorists of identi-

fied road hazards. In this case, one of a set of particular signals is modulated within a radar band by a transmitter operated near the roadway. The receiver decodes the transmission and warns the driver of the hazard.

[0627] LIDAR devices emit an infrared laser signal, which is then reflected off a moving vehicle and analyzed for delay, which relates to distance. Through successive measurements, a speed can be calculated. A LIDAR detector therefore seeks to detect the characteristic pulsatile infrared energy.

[0628] Police radios employ certain restricted frequencies, and in some cases, police vehicles continuously transmit a signal. While certain laws restrict interception of messages sent on police bands, it is believed that the mere detection and localization of a carrier wave is not and may not be legally restricted. These radios tend to operate below 800 MHz, and thus a receiver may employ standard radio technologies.

[0629] Potholes and other road obstructions and defects have two characteristics. First, they adversely effect vehicles which encounter them. Second, they often cause a secondary effect of motorists seeking to avoid a direct encounter or damage, by slowing or executing an evasive maneuver. These obstructions may therefore be detected in three ways; first, by analyzing the suspension of the vehicle for unusual shocks indicative of such vents; second, by analyzing speed and steering patterns of the subject vehicle and possibly surrounding vehicles; and third, by a visual, ultrasonic, or other direct sensor for detecting the pothole or other obstruction. Such direct sensors are known; however, their effectiveness is limited, and therefore an advance mapping of such potholes and other road obstructions greatly facilitates avoiding vehicle damage and executing unsafe or emergency evasive maneuvers. An advance mapping may also be useful in remediation of such road hazards, as well.

[0630] Traffic jams occur for a variety of reasons. Typically, the road carries traffic above a threshold, and for some reason the normal traffic flow patterns are disrupted. Therefore, there is a dramatic slowdown in the average vehicle speed, and a reduced throughput. Because of the reduced throughput, even after the cause of the disruption has abated, the roadways may take minutes to hours to return to normal. Therefore, it is typically desired to have advance warnings of disruptions, which include accidents, icing, rain, sun glare, lane closures, road debris, police action, exits and entrances, and the like, in order to allow the driver to avoid the involved region or plan accordingly. Abnormal traffic patterns may be detected by comparing a vehicle speed to the speed limit or a historical average speed, by a visual evaluation of traffic conditions, or by broadcast road advisories. High traffic conditions are associated with braking of traffic, which in turn results in deceleration and the illumination of brake lights. Brake lights may be determined by both the specific level of illumination and the center brake light, which is not normally illuminated. Deceleration may be detected by an optical, radar or LIDAR sensor for detecting the speed and/or acceleration state of nearby vehicles.

[0631] While a preferred embodiment of the present invention employs one or more sensors, broadcast advisories, including those from systems according to or compatible with the present invention, provide a valuable source of information relating to road conditions and information of interest at a particular location. Therefore, the sensors need not form a part of the core system. Further, some or all of the required sensors may be integrated with the vehicle electronics ("vetronics"), and therefore the sensors may be provided

separately or as options. It is therefore an aspect of an embodiment of the invention to integrate the transceiver, and event database into a vetronics system, preferably using a digital vetronics data bus to communicate with existing systems, such as speed sensors, antilock brake sensors, cruise control, automatic traction system, suspension, engine, transmission, and other vehicle systems.

[0632] According to one aspect of the invention, an adaptive wise control system is provided which, in at least one mode of operation, seeks to optimize various factors of vehicle operation, such as fuel efficiency, acceleration, comfort, tire wear, etc. For example, an automatic acceleration feature is provided which determines a most fuel-efficient acceleration for a vehicle. Too slow an acceleration will result in increased time at suboptimal gear ratios, while too fast acceleration will waste considerable fuel. Actual operating efficiency may be measured during vehicle use, allowing an accurate prediction of fuel efficiency under dynamically changing conditions, such as acceleration. Vehicle sensors may assist in making a determination that optimum acceleration is safe; objects both in front and behind the vehicle may be sensed. If an object is in front of the vehicle, and the closing speed would predict a collision, then the acceleration is decreased, or even brakes applied. If an object is rapidly advancing from the rear, the acceleration may be increased in order to avoid impact or reduce speed differential. See, U.S. Pat. Nos. 6,445,308 (Koike, Sep. 3, 2002, Positional data utilizing inter-vehicle communication method and traveling control apparatus), 6,436,005 (Bellinger, Aug. 20, 2002, System for controlling drivetrain components to achieve fuel efficiency goals), 6,418,367 (Toukura, et al., Jul. 9, 2002, Engine transmission control system), expressly incorporated herein by reference.

[0633] Likewise, the operation of a vehicle may be optimized approaching a stop, such as a stop sign, red light, or the like. In this case, the system optimization may be more complex. In addition to fuel economy, wear on brakes, engine (especially if compression braking is employed), transmission, tires, suspension, time, accident-related risks, and the like, may also be included. In the case of a stop sign, the issue also arises with respect to a so-called "rolling stop". Such a practice provides that the vehicle does not actually stop, but reaches a sufficiently low speed that the driver could stop if required by circumstances. While this practice is technically considered a violation, in many instances, it is both efficient and useful. For example, a stop line is often located behind an intersection, with impaired visibility. Thus, the vehicle might come to a complete stop, begin to accelerate, and then find that the intersection is not clear, and be forced to stop again. One particular reason for a rolling stop is the storage of energy in the vehicular suspension during acceleration and deceleration. As the vehicle comes to a stop, the springs and shock absorbers of the suspension undergo a clamped oscillation, which is relatively uncomfortable, and destabilizes the vehicle and its contents.

[0634] According to one aspect of the present invention, the driver may locate a deceleration target and/or a target speed. The vehicle navigation system may assist, recording an exact location of a stop line, geographic (hills, curves, lane marker locations, etc.), weather conditions (ice, sand, puddles, etc.) and other circumstances surrounding the vehicle. Other vehicles and obstructions or pedestrians, etc. may also be identified and modeled. Using models of the various components, as well as cost functions associated with each, as well

as subjective factors, which may include vehicle occupant time-cost and comfort functions, an optimal acceleration or deceleration profile may be calculated. The system may therefore express control over throttle, brakes, transmission shifts, clutch, valve timing, suspension controls, etc., in order to optimize vehicle performance.

[0635] See US patent Nos. (expressly incorporated herein by reference): U.S. Pat. Nos. 6,503,170; 6,470,265; 6,445,308; 6,292,743; 6,292,736; 6,233,520; 6,230,098; 6,220,986; 6,202,022; 6,199,001; 6,182,000; 6,178,377; 6,174,262; 6,098,016; 6,092,014; 6,092,005; 6,091,956; 6,070,118; 6,061,003; 6,052,645; 6,034,626; 6,014,605; 5,990,825; 5,983,154; 5,938,707; 5,931,890; 5,924,406; 5,835,881; 5,774,073; 6,442,473; 4,704,610; 5,712,632; 5,973,616; and 6,008,741.

[0636] The radio used for the communications subsystem can be radio frequency AM, FM, spread spectrum, microwave, light (infrared, visible, UV) or laser or maser beam (millimeter wave, infrared, visible), or for short distance communications, acoustic or other communications may be employed. The system preferably employs an intelligent transportation system (ITS) or Industrial, Scientific and Medical (ISM) allocated band, such as the 915 MHz, 2.4 MHz or 5.8 GHz band. (The 2.350-2.450 GHz band corresponds to the emission of microwave ovens, and thus the band suffers from potentially significant interference). The 24.125 GHz band, corresponding to K-band police radar, may also be available; however, transmit power in this band is restricted, e.g., less than about 9 mW. The signal may be transmitted through free space or in paths including fiber optics, waveguides, cables or the like. The communication may be short or medium range omnidirectional, line of sight, reflected (optical, radio frequency, retroreflector designs), satellite, secure or non-secure, or other modes of communications between two points, that the application or state-of-the-art may allow. The particular communications methodology is not critical to the invention, although a preferred embodiment employs a spread spectrum microwave transmission.

[0637] A particularly preferred communications scheme employs steerable high gain antennas, for example a phased array antenna, which allows a higher spatial reuse of communications bands and higher signal to noise ratio than an omnidirectional antenna.

[0638] A number of Dedicated Short Range Communications (DSRC) systems have been proposed or implemented in order to provide communications between vehicles and roadside systems. These DSRC systems traditionally operate in the 900 MHz band for toll collection, while the FCC has recently made available 75 MHz in the 5.850-5.925 GHz range for such purposes, on a co-primary basis with microwave communications, satellite uplinks, government radar, and other uses. However, spectrum is also available in the so-called U-NII band, which encompasses 5.15-5.25 GHz (indoors, 50 mW) and 5.25-5.35 GHz (outdoors, 250 mW). A Japanese ITS ("ETC") proposal provides a 5.8 GHz full duplex interrogation system with a half duplex transponder, operating at about 1 megabit per second transmission rates.

[0639] In August 2001, the DSRC standards committee (ASTM 17.51) selected 802.11a as the underlying radio technology for DSRC applications within the 5.850 to 5.925 GHz band. The IEEE 802.11a standard was modified, in a new standard referred to as 802.11a R/A (roadside applications) to

meet DSRC deployment requirements, and includes OFDM modulation with a lower data rate, 27 MBS for DSRC instead of 54 MBS for 802.11a.

[0640] Proposed DSRC applications include:

[0641] Emergency Vehicle Warning—Currently, emergency vehicles only have sirens and lights to notify of their approach. With DSRC, the emergency vehicle can have the traffic system change traffic lights to clear traffic along its intended route. Also, this route information can be broadcast to other cars to provide user/vehicle specific directions to reduce collisions.

[0642] Traffic congestion data can be exchanged between vehicles. On-coming traffic exchanges information on traffic status ahead so that vehicle navigation systems can dynamically provide the best route to a destination.

[0643] An industry standard interoperable tolling platform could expand the use of toll systems or processing payments at parking lots, drive-through establishments (food, gas), etc.

[0644] Safety applications could benefit from use of DSRC. The DSRC automaker consortium (DaimlerChrysler, GM, Ford, Toyota, Nissan, & VW) are seeking ways to enhance passenger safety with DSRC communications. For example, in a typical collision, a car has only 10 milliseconds to tighten seatbelts, deploy airbags, etc. If an additional advance warning of 5 milliseconds was provided, one could tighten seatbelts, warm-up the airbags, etc. to prepare the car for collision. Using radar, GPS data, etc. a car can determine that a collision is imminent, and it can then notify the car about to be hit to prepare for collision.

[0645] See: ASTM E2213-02—Standard Specification for Telecommunications and Information Exchange Between Roadside and Vehicle Systems—5 GHz Band Dedicated Short Range Communications (DSRC) Medium Access Control (MAC) and Physical Layer (PHY) Specifications (This standard, ASTM E2213-02—Standard Specification for Telecommunications and Information Exchange Between Roadside and Vehicle Systems—5 GHz Band Dedicated Short Range Communications (DSRC) Medium Access Control (MAC) and Physical Layer (PHY) Specifications, describes a medium access control layer (MAC) and physical layer (PHY) specification for wireless connectivity using dedicated short-range communications (DSRC) services. This standard is based on and refers to the Institute of Electrical and Electronics Engineers (IEEE) standard 802.11 (Wireless LAN Medium Access Control and Physical Layer specifications), and standard 802.11a (Wireless LAN Medium Access Control and Physical Layer specifications High-Speed Physical Layer in the 5 GHz band). This standard is an extension of IEEE 802.11 technology into the high-speed vehicle environment. It contains the information necessary to explain the difference between IEEE 802.11 and IEEE 802.11a operating parameters required to implement a mostly high-speed data transfer service in the 5.9-GHz Intelligent Transportation Systems Radio Service (ITS-RS) band or the Unlicensed National Information Infrastructure (UNII) band, as appropriate).

[0646] ANSI X3.38-1988 (R1994)—Codes—Identification of States, the District of Columbia, and the Outlying and Associated Areas of the United States for Information Interchange

[0647] ASTM PS111-98—Specification for Dedicated Short Range Communication (DSRC) Physical Layer Using Microwave in the 902 to 928 MHz Band

[0648] ASTM PS105-99—Specification for Dedicated Short Range Communication (DSRC) Data Link Layer: Medium Access and Logical Link Control

[0649] CEN Draft Document: prENV278/9/#65 Dedicated Short Range Communication (DSRC)—Application Layer (Layer 7)

[0650] IEEE Std 1489-1999—Standard for Data Dictionaries for Intelligent Transportation Systems—Part 1: Functional Area Data Dictionaries

[0651] GSS Global Specification for Short Range Communication. The platform for Interoperable Electronic Toll Collection and Access Control

[0652] ISO 3166-1:1997—Codes for the representation of names of countries and their subdivisions—Part 1: Country codes

[0653] ISO 3779:1983—Road vehicles—Vehicle identification numbering (VIN)—Content and structure

[0654] ISO/IEC 7498-1:1994—Information technology—Open Systems Interconnection—Basic Reference Model: The Basic Model

[0655] ISO 7498-2:1989—Information processing systems—Open Systems Interconnection—Basic Reference Model—Part 2: Security Architecture

[0656] ISO/IEC 7498-3:1997—Information technology—Open Systems Interconnection—Basic Reference Model: Naming and addressing

[0657] ISO/IEC 7498-4:1989—Information processing systems—Open Systems Interconnection—Basic Reference Model—Part 4: Management framework

[0658] ISO 3780:1983—Road vehicles—World manufacturer identifier (WMI) code

[0659] ISO/IEC 8824-1:1995—Information technology—Abstract Syntax Notation One (ASN.1): Specification of basic notation

[0660] ISO/IEC 8825-2:1996—Information technology—ASN.1 encoding rules: Specification of Packed Encoding Rules (PER)

[0661] ISO TC204 WG15 Committee Of Japan TICS/DSRC—DSRC Application Layer High Data Rate mobile environment

[0662] ASTM E2158-01—Standard Specification for Dedicated Short Range Communication (DSRC) Physical Layer Using Microwave in the 902-928 MHz Band

[0663] ASTM PS105-99—Standard Provisional Specification for Dedicated Short Range Communication (DSRC) Data Link Layer

[0664] IEEE Std 1455-1999—Standard for Message Sets for Vehicle/Roadside Communications

[0665] IEEE Std 802.11-1999—Information Technology—Telecommunications and information exchange between systems—Local and metropolitan area networks—Specific requirements—Part 11: Wireless LAN Medium Access Control and Physical Layer specifications

[0666] IEEE Std 802.11a-1999—Information Technology—Telecommunications and information exchange between systems—Local and metropolitan area networks—Specific requirements—Part 11: Wireless LAN Medium Access Control and Physical Layer specifications: High Speed Physical Layer in the 5 GHz band

[0667] Each of which is expressly incorporated herein in its entirety.

[0668] It is noted that the present technology has the capability for streamlining transportation systems, by communicating traffic conditions almost immediately and quickly

allowing decisions to be made by drivers to minimize congestion and avoid unnecessary slowdowns. A particular result of the implementation of this technology will be a reduction in vehicular air pollution, as a result of reduced traffic jams and other inefficient driving patterns. To further the environmental protection aspect of the invention, integration of the database with cruise control and driver information systems may reduce inefficient vehicle speed fluctuations, by communicating to the driver or controlling the vehicle at an efficient speed. As a part of this system, therefore, adaptive speed limits and intelligent traffic flow control devices may be provided. For example, there is no need for fixed time traffic lights if the intersection is monitored for actual traffic conditions. By providing intervehicle communications and identification, such an intelligent system is easier to implement. Likewise, the 55 miles per hour speed limit that was initially presented in light of the “oil crisis” in the 1970’s, and parts of which persist today even in light of relatively low petroleum pricing and evidence that the alleged secondary health and safety benefit is marginal or non-existent, may be eliminated in favor of a system which employs intelligence to optimize the traffic flow patterns based on actual existing conditions, rather than a static set of rules which are applied universally and without intelligence.

[0669] The communications device may be a transmitter, receiver or transceiver, transmitting event information, storing received event information, or exchanging event information, respectively. Thus, while the system as a whole typically involves a propagation of event information between remote databases, each system embodying the invention need not perform all functions.

[0670] In a retroreflector system design, signal to noise ratio is improved by spatial specificity, and typically coherent detection. An interrogation signal is emitted, which is modulated and redirected back toward its source, within a relatively wide range, by a receiver. Thus, while the receiver may be “passive”, the return signal has a relatively high amplitude (as compared to nonretroreflective designs under comparable conditions) and the interrogator can spatially discriminate and coherently detect the return signal. Both optical and RF retroreflector systems exist. This technique may also be used to augment active communications schemes, for example allowing a scanning or array antenna to determine an optimal position or spatial sensitivity or gain, or a phase array or synthetic aperture array to define an optimal spatial transfer function, even in the presence of multipath and other types of signal distortion and/or interference.

[0671] According to one embodiment of the invention, a plurality of antenna elements are provided. These may be, for example, a set of high gain antennas oriented in different directions, or an array of antennas, acting together. Accordingly, the antenna structure permits a spatial division multiplexing to separate channels, even for signals which are otherwise indistinguishable or overlapping. For example, this permits a single antenna system to communicate with a plurality of other antenna systems at the same time, with reduced mutual interference. Of course, these communications channels may be coordinated to further avoid overlap. For example, the communications band may be subdivided into multiple channels, with respective communications sessions occurring on different channels. Likewise, a plurality of different bands may be simultaneously employed, for example 802.11g (2.4 GHz), 802.11a (5.4 GHz), and 802.11a R/A (5.9 GHz). In another embodiment, a mechanically scanning high

gain antenna may provide directional discrimination. Such an antenna may be, for example, a cylindrical waveguide electromagnetically reflective at one end, having a diameter corresponding to the wavelength of the band, and with a probe extending about half-way into the cylinder perpendicularly to its axis, at about a quarter wavelength from the reflective end. Likewise, a so-called “Pringles Can Antenna”, which has been termed a Yagi design, and known modifications thereof, have been deemed useful for extending the range of 802.11b communications.

[0672] According to one embodiment, a radome may be provided on the roof of a vehicle, having therein an antenna array with, for example, 4-64 separate elements. These elements, are, for example, simple omnidirectional dipole antennas. The size and spacing of the antenna elements is generally determined by the wavelength of the radiation. However, this distance may be reduced by using a different dielectric than air. For example, see U.S. Pat. No. 6,452,565, expressly incorporated herein by reference. See, also www.antenova.com (Antenova Ltd., Stow-cum-Quy, Cambridge, UK).

[0673] A preferred radome also includes a GPS antenna, as well as cellular radio antenna (IS-95, PCS, GSM, etc.).

[0674] In a preferred embodiment, the communications device employs an unlicensed band, such as 900 MHz (902-928 MHz), FRS, 49 MHz, 27 MHz, 2.4-2.5 GHz, 5.4 GHz, 5.8 GHz, etc. Further, in order to provide noise immunity and band capacity, spread spectrum RF techniques are preferred.

[0675] In one embodiment, communications devices are installed in automobiles. Mobile GPS receivers in the vehicles provide location information to the communications devices. These GPS receivers may be integral or separate from the communications devices. Event detectors, such as police radar and laser (LIDAR) speed detectors, traffic and weather condition detectors, road hazard detectors (pot holes, debris, accidents, ice, mud and rock slides, drunk drivers, etc.), traffic speed detectors (speedometer reading, sensors for detecting speed of other vehicles), speed limits, checkpoints, toll booths, etc., may be provided as inputs to the system, or appropriate sensors integrated therein. The system may also serve as a beacon to good Samaritans, emergency workers and other motorists in the event of accident, disablement, or other status of the host vehicle.

[0676] It is noted that at frequencies above about 800 MHz, the transmitter signal may be used as a part of a traffic radar system. Therefore, the transmitted signal may serve both as a communications stream and a sensor emission. Advantageously, an electronically steerable signal is emitted from an array. Reflections of the signal are then received and analyzed for both reflection time coefficients and Doppler shifts. Of course, a radar may use static antennas and/or mechanically scanning antennas, and need not completely analyze the return signals.

[0677] Functions similar to those of the Cadillac (GM) On-Star system may also be implemented, as well as alarm and security systems, garage door opening and “smart home” integration. Likewise, the system may also integrate with media and entertainment systems. See, U.S. Pat. Nos. 6,418,424; 6,400,996; 6,081,750; 5,920,477; 5,903,454; 5,901,246; 5,875,108; 5,867,386; 5,774,357, expressly incorporated herein by reference. These systems may reside in a fixed location, within the vehicle, or distributed between fixed and mobile locations. The system may also integrate with a satellite radio system, and, for example, the satellite radio

antenna may be included in the antenna system for other communication systems within the vehicle.

[0678] The memory stores information describing the event as well as the location of the event. Preferably, the memory is not organized as a matrix of memory addresses corresponding to locations, e.g., a “map”, but rather in a record format having explicitly describing the event and location, making storage of the sparse matrix more efficient and facilitating indexing and sorting on various aspects of each data record. Additional information, such as the time of the event, importance of the event, expiration time of the event, source and reliability of the event information, and commercial and/or advertising information associated with the event may be stored. The information in the memory is processed to provide a useful output, which may be a simple alphanumeric, voice (audible) or graphic output or the telecommunications system. In any case, the output is preferably presented in a sorted order according to pertinence, which is a combination of the abstract importance of the event and proximity, with “proximity” weighted higher than “importance”. Once a communication or output cycle is initiated, it may continue until the entire memory is output, or include merely output a portion of the contents.

[0679] Typically, a navigation system includes a raster “map” of geographic regions, which is further linked to a database of features, geocoded to the map. Alternately, the map may itself be a set of geocoded features, without a raster representation. Various events and features defined by the sensors provided by the present system, or received through a communications link, may therefore be overlaid or integrated into the geocoded features. Advantageously, all of the geocoded features are separately defined from the static geography, and therefore may be separately managed and processed. For example, geologic features are persistent, and absent substantial human activity or natural disaster, are persistent. Other features, such as roads, attractions, and other conditions, are subject to change periodically. Each geocoded feature (or indeed, any feature or event, whether geocoded or not) may be associated with a timeconstant representing an estimated life; as the time since last verification increases, the probability of change also increases. This may be used to provide a user with an estimation of the reliability of the navigation system, or indeed any output produced by the system. It is noted that the timeconstant may also be replaced with an expression or analysis which is a function of time, that is, to account for diurnal, weekly, seasonal, annual, etc. changes. Such expression or analysis need to be repetitive; for example, after an abnormality in traffic flow, traffic patterns tend to remain distorted for a long period (e.g., hours) after the abnormality is corrected, or after a driver passes the abnormality; this distortion is both temporally and spatially related to the original abnormality, and may be statistically estimated. Chaos, fractal and/or wavelet theories may be particularly relevant to this analysis.

[0680] In outputting information directly to a human user, thresholds are preferably applied to limit output to events which are of immediate consequence and apparent importance. For example, if the communications device is installed in a vehicle, and the information in the memory indicates that a pothole, highway obstruction, or police radar “trap” is ahead, the user is informed. Events in the opposite direction (as determined by a path or velocity record extracted from the position detector) are not output, nor are such events far away. On the other hand, events such as road icing, flooding, or the

like, are often applicable to all nearby motorists, and are output regardless of direction of travel, unless another communications device with event detector indicates that the event would not affect the local communications device or the vehicle in which it is installed.

[0681] According to an embodiment of the invention, relevance of information and information reliability are represented as orthogonal axes. For each set of facts or interpretation (hypothesis) thereof, a representation is projected on the plane defined by these two axes. This representation for each event generally takes the form of a bell curve, although the statistics for each curve need not be Gaussian. The area under the superposed curves, representing the constellation of possible risks or relevances, are then integrated, starting with relevance=1.00 (100%), proceeding toward relevance=0.00 (0%). As the area under a given peak exceeds a threshold, which need not be constant, and indeed may be a function of relevance or reliability, and/or subjective factors, the event is presented as a warning output to the user. This method ensures that the output includes the most relevant events before less relevant events, but excluding those events with low reliability. Using a dynamic threshold, highly relevant events of low reliability are presented, while low relevance events of even modest reliability are suppressed. It is possible for the threshold to exceed 1.0, that is, a complete suppression of irrelevant events, regardless of reliability.

[0682] Alternately, the event projection into the relevance-reliability plane may be normalized by a function which accounts for the desired response function, with a static threshold applied.

[0683] The reason why the determination employs an integration of a stochastic distribution, rather than a simple scalar representation of events, is that this allows certain events with broad distributions, but a mean value below than of another event with a narrower distribution, to be ranked ahead, as being more significant. This has potentially greater impact for events having decidedly non-normal distributions, for example with significant kurtosis, skew, multimodality, etc., and in which a mean value has no readily interpretable meaning.

[0684] The present invention therefore provides a method, comprising receiving a set of facts or predicates, analyzing the set of facts or predicates to determine possible events, determining, from the possible events, a relevance to a user and associated statistical distribution thereof, and presenting a ranked set of events, wherein said ranking is dependent on both relevance and associated statistical distribution. The associated statistical distribution, for example, describes a probability of existence of an associated event, and the relevance comprises a value function associated with that event if it exists, wherein said ranking comprises an analysis of probability-weighted benefits from each event to an overall utility function for the user. The ranking may comprise a combinatorial analysis of competing sets of rankings.

[0685] It is therefore apparent that each event, that is, a set of facts or factual predicates, or conclusions drawn therefrom, are represented as a distribution projected into a relevance-reliability plane. On the abscissa, relevance has a scale of 0 to 1. At zero relevance, the information is considered not useful, whereas at a relevance value approaching 1, the information is considered very relevant. Since the determination of relevance is generally not exact nor precise, there is an associated reliability, that is, there is a range of possibilities and their likelihoods relating to a set of presumed facts. The

various possibilities sum to the whole, which means that the area under the curve (integral from 0 to 1 of the distribution curve) should sum to 1, although various mathematical simplifications and intentional or unintentional perturbations may alter this area. Relevance requires a determination of context, which may include both objective and subjective aspects. Relevance typically should be determined with respect to the requestor, not the requestee, although in certain circumstances, the requestee (possibly with adjustments) may serve as a proxy for the requestor. There are a number of methods for weighting higher relevances above lower relevances. One way is to determine a transfer function which masks the normalized distribution with a weighting function. This may be a simple linear ramp, or a more complex function. As discussed above, a numeric integration from 1 to 0, with a respective decision made when the integral exceeds a threshold, allowing multiple decisions to be ranked, is another possibility.

[0686] Using a hierarchical analysis, this process may occur at multiple levels, until each significant hypothesis is analyzed, leaving only putative hypothesis which are insignificant, that is, with sufficient external information to distinguish between the respective possibilities. In order to simplify the output set, redundancy is resolved in favor of the most specific significant hypothesis, while insignificant hypotheses are truncated (not presented). As the number of significant hypotheses becomes in excess of a reasonable number (which may be an adaptive or subjective determination), related hypotheses may be grouped. Relatedness of hypotheses may be determined based on commonality of factual predicates, resulting user action, or other commonality. That is, the grouping may be the same as, or different from, the hierarchy of the analysis.

[0687] It is also noted that the projection need not be in the relevance-reliability plane. Rather, the analysis is intended to present useful information: that which represents information having a potential materiality to the user, and which has significance in a statistical sense. Therefore, a data analysis which does not purely separate relevance and reliability, but nevertheless allows a general balancing of these issues, may nevertheless be suitable.

[0688] This type of analysis may also be used to normalize utility functions between respective bidders. To determine a cost, a local set of events or factual predicates are analyzed with respect to a received context. The various hypotheses are projected onto a relevance-reliability plane. With respect to each user, the projection of each event is normalized by that user's conveyed utility function. It is useful to maintain the stochastic distribution representation for each event, since this facilitates application of the user utility function. The winning bidder is the bidder with the highest normalized integration of the event representation in the relevance-reliability projection plane.

[0689] Advantageously, according to embodiment of the present invention, output information is presented to the user using a statistical and/or probabilistic analysis of both risk and reliability. Risk is, for example, the estimated quantitative advantage or disadvantage of an event. In the case of competing risks, a cost function may be employed to provide a normalized basis for representation and analysis. While the risk is generally thought of as a scalar value, there is no particular reason why this cannot itself be a vector or multi-parameter function, such as a mean and standard deviation or confidence interval. Reliability is, for example, the probabil-

ity that the risk is as estimated. Likewise, the reliability may also be a scalar value, but may also be a complex variable, vector or multiparameter function.

[0690] Since a preferred use of the risk and reliability estimates is as part of a user interface, these are preferably represented in their simplest forms, which will typically take a scalar form, such as by projection from a high dimensionality space to a low dimensionality space, or an elimination or truncation of information which is predicted to be of low significance in a decision-making process. However, where the risk, or risk profile, cannot be simply represented, or such representation loses significant meaning, a higher dimensionality representation may be employed. For human user interfaces, graphic displays are common, which generally support two-dimensional graphics, representing three dimensional distributions, for example, x, y, and brightness or color. Using a time sequence of graphic elements, one or more additional dimensions may be represented. Likewise, some graphic displays are capable of representing depth, and thus support an additional degree of freedom. Therefore, it can be seen that the risk and reliability are not intrinsically limited to scalar representations, and where the quantity and quality of the information to be presented warrants, a higher dimensionality or additional degrees of freedom may be presented.

[0691] In a voice output system, a sequence of information may be output, trading immediacy and semantic complexity for information content. Complex sounds or other grammars may also be employed, especially where the relevance has a short time-constant.

[0692] According to one embodiment of the invention, risk and reliability are separately output to the user. It is understood that both risk and reliability may be output in an integral or interrelated form as well. For example, a driver might wish to employ a radar detector. A traditional radar detector emits a signal indicative of signal type and signal strength. Based on these emissions, the driver decides on a course of action. Ideally, the driver responds immediately (if necessary) to the first detected signal, even if this is of low signal strength or potentially an artifact. On the other hand, the system according to the present invention may analyze the reliability of the detected signal as an indicator of risk. For example, on a highway, an X band radar signal directed from in front of the vehicle, which commences at relatively high signal strength, and which occurs in a location having a past history of use as a location for monitoring traffic speeds for enforcement purposes, and which was recently confirmed (e.g., within the past 5 minutes) as being an active traffic enforcement site, would be deemed a high reliability signal. On the other hand, on the same highway, if a continuously emitted (or half-wave 60 Hz emission) X band signal is detected, in a location where such a signal is consistently detected by other drivers, and none is cited for violation of traffic laws, then this detection would be considered a low reliability detection of a risk or traffic enforcement radar. While a threshold of reliability may be applied, and thus a “squench” applied to the risk output, preferably, the reliability signal is presented separately. When risk and reliability are both high, for example, an enhanced alert may be presented. When risk is high but reliability low, an indication may be nevertheless presented to the user for his analysis. This scheme would assist the user in dealing with statistical aberrations, as well as intentional masking of conditions. For example, a traffic enforcement radar system may be intentionally used in an area of normal interference with

radar detectors; the system according to the present invention would present an alert to the user of this possibility.

[0693] Such analysis is not limited to radar detectors. For example, a bridge may be likely to freeze (i.e., become slippery) under certain conditions. Some of these conditions may be detected, such as local weather, past precipitation, and the like. Indeed, recent road sand and salt may also be accounted for. However, uncertainty remains as to the actual road surface conditions, which may change over the course of a few minutes. Therefore, the system according to the present invention may determine the risk, i.e., slippery road conditions, and the reliability of its determination. This reliability may be estimated from actual past experience of the system in question, as well as from other systems including appropriate sensors, for which data is available.

[0694] According to the present invention, to risk tolerance, or more properly stated, the reliability-adjusted risk tolerance of a user may be used to “normalize” or otherwise adjust the outputs of the system. Thus, for example, an emergency vehicle may take higher risks than would normally be acceptable. Clearly, if there is a 100% probability that the vehicle will skid on black ice on the road ahead, this risk would be unacceptable for any rational driver seeking to continue driving. On the other hand, an ambulance driver on an urgent call may be willing to undertake a 5% risk that the road is slippery, while a normal driver might be willing to accept only a 1% risk. The ambulance driver, in the above example, generally takes a number of risks, and caution must be balanced to assure that the goals are met, and indeed that risks are not increased as a result of undue caution. For example, driving at a slow speed increases the risk that the vehicle will be rear-ended, or that the driver will fall asleep during the trip. Even pulling over the side of the road does not eliminate risk to zero, so it is important to do a comparative risk analysis.

[0695] The risk/reliability analysis is not limited to driving condition alerts. For example, the system may be used to advise the user regarding the need for preventive maintenance or repair. The system may also be used as part of an entertainment system: What is the likelihood that a channel will broadcast an undesired commercial within the next minute? Should a recording stored in memory be purged in favor of a new recording? What radio station will be most acceptable to the set of occupants of the vehicle?

[0696] In some cases, therefore, the risk/reliability analysis may be used by an automated system, and need not be presented directly to the user; in other instances, the set of information is for presentation to the user.

[0697] Another aspect of the invention involves a method for presentation of a multidimensional risk profile to a user. According to prior systems, a “risk” is presented to a user as a binary signal, modulated binary signal, and/or a scalar value. A signal type (e.g., band, SWS code, etc. for a radar detector, temperature, wind speed, wind direction, barometric pressure and trend, for a weather gauge) may also be expressed. Accordingly, as set of orthogonal scalar values is presented representing different parameters. Certainly, graphic representations of mean and standard deviation are well known; however, the reliability aspect of the present invention is not analogous to a simple standard deviation—it typically represents something qualitatively different. For example, a determination of the magnitude of the risk variable carries its own standard deviation, which, though a possible element of a reliability determination, does not address the issue of how the measured parameter (with its own statistical

parameters of measurement) relates to the underlying issue. In some cases, there will be a direct relationship and near 100% correlation between the measured parameter and risk variable; in other cases, the measured parameter has poor correlation with the risk variable, and further analysis is necessary.

[0698] The system preferably ages event data intelligently, allowing certain types of events to expire or decrease in importance. A traffic accident event more than 12 hours old is likely stale, and therefore would not be output, and preferably is purged; however, locations which are the site of multiple accidents may be tagged as hazardous, and the hazard event output to the user as appropriate.

[0699] A temporal analysis may also be applied to the event data, and therefore diurnal variations and the like accounted for. Examples of this type of data include rush hour traffic, sun glare (adjusted for season, etc.), vacation routes, and the like.

[0700] Thus, user outputs may be provided based on proximity, importance, and optionally other factors, such as direction, speed (over or under speed limit), time-of-day, date or season (e.g., sun glare), freshness of event recordation, and the like.

[0701] According to the present invention, a stored event may be analyzed for reliability. Such reliability may be determined by express rules or algorithms, statistically, or otherwise, generally in accordance with particular characteristics of the type of event. Thus, even where a detected value, at the time of measurement, has a high reliability for indicating an event or condition, over time the reliability may change.

[0702] U.S. Pat. No. 6,175,803 (Chowanic, et al., Ford Global Technologies, Inc.), expressly incorporated herein by reference in its entirety, relates to a telematics system which employs routing criteria which include a statistical risk index. The route and associated risks may be output together, and a risk-minimized route may be automatically selected.

[0703] According to a preferred embodiment, audio and/or visual warnings are selectively provided. In this case, a warning of only a single event is provided at any given time. Typically, a visual alert indicator illuminates, and an initial tone alert indicates the nature of an urgent warning. The visual indicator also outputs a strength or proximity of the alert. Typically, these basic indicators are illuminated red, because this color is societally associated with alerts, and this causes less constriction of the iris of the eye at night. A separate visual indicator, such as a bar graph, meter, or color coded indicator (e.g., bicolor or tricolor light emitting diode) provides a separate reliability or risk of reliance indication. After acoustically indicating the nature and strength or proximity of the warning, an acoustic indication of reliability or risk of reliance may be enunciated. The visual reliability or risk of reliance indicator is constantly active, while the warning indicator is selectively active when an alert is present.

[0704] Typically, alerts will be classified by category, and a separate algorithm applied to determine the appropriate reliability factor, for example an exponential decay. As updated information is received or becomes available, this replaces presumably less reliable older data as a basis for a reliability determination. The system may also anticipate a geographic change in location of the event, for example a traffic enforcement officer in motion, or a traffic jam, along with reliability information for the prediction.

[0705] When multiple alerts are simultaneously active, low priority alerts are suppressed, and the active higher-priority alerts alternate. Priority of alerts, in this case, may be deter-

mined based on the nature of the alert, contextual proximity, the reliability of the measurement of the alert, the reliability of reliance on the recorded information, and a comparison of the respective alerts and potential interaction.

[0706] At any time, there will likely be a number “issues” to be analyzed. In order to provide an efficient user interface, these issues are analyzed to determine urgency or importance, and only those which meet criteria are particularly presented. For example, the fact that the fuel gauge reads half-full is not normally a cause for particular alert. However, if the vehicle is passing a gas station which has a relatively low price, the alert may be welcome. Without further information, these facts together reach a sufficient importance to produce an alert. See, U.S. Pat. No. 6,484,088 (Reimer, Nov. 19, 2002, Fuel optimization system with improved fuel level sensor), expressly incorporated herein by reference. That is, the risk (need for fuel; capacity to purchase additional fuel; distance to next gas station and margin of safety given present fuel supply; etc.), and the reliability (fuel price predicted to be cheaper than other fuel along predicted vehicle path before urgent need for fuel; etc.), together meet a “threshold” (which, of course, may be particularly dynamic in nature). Additional information, however, may reduce the importance of this information below a threshold level; for example, the present trip is time critical; the same gas station is predicted to be passed a number of times before the fuel tank is empty; other stations predicted to be passed have lower prices; pricing is anticipated to be more advantageous at a later time (e.g., gas sale on Monday; anticipated trip to another locale with lower gas prices; etc.), etc. Thus, the set of facts including available information is analyzed, for example using Bayesian techniques, Hierarchical Markov Models or other techniques, to predict the importance to the user. Each of these facts or predicates, or sets of facts and/or predicates, of course, has its own estimated reliability, and thus the overall conclusion is thereby limited. Accordingly, this reliability of the logical conclusion is output along with the conclusion itself.

[0707] With sufficient facts or predicates available, there may be competing outputs, both relating to fuel use, conservation, and refill strategies and otherwise. Thus, the system must compare the competing prospective outputs to determine which are actually presented. It may be useful in such circumstances to compute a cost function for presenting this data. In this way, for example, an advertiser or other external influence may be permitted to impact the overall analysis, e.g., presentation of data through the user interface. This cost function may also balance driving conditions: for example, when stopped at a traffic light, less urgent messages may be presented with lower risk of driver distraction. The user interface typically supports only a limited amount of information to be conveyed, and ergonomics may further limit the amount of information. Thus, there will typically arise the issue of screening information for presentation to the user.

[0708] The cost function is analogous to a utility function, which may be perturbed or modified based on subjective factors. As such, automated negotiations are possible based on bidder and auctioneer contexts, and predetermined and/or adaptive parameters. By communicating complex, un-normalized information, and allowing an ex post facto reduction in dimensionality or degrees of freedom, greater efficiency may be obtained.

[0709] In choosing which information to present, a preferred embodiment according to the present invention ana-

lyzes the risk and reliability, to produce a composite weight or cost, which may then be compared with other weights or costs, as well as a dynamic threshold, which may be separately analyzed or implemented as a part of a cost function. Taking a simple case first, information which is immediately applicable, represents a high degree of risk, and which is reliable, is presented with a highest weighting. If the same indication is unreliable, then the presentation is dewighted. A high risk with a low reliability would compete with a low risk with high reliability for presentation through the user interface. As previously discussed, a cost function may be used to factor in external or artificial considerations as well.

[0710] If the risk or reliability changes as a function of time, and this is the significant temporal relationship, then these factors may be changed updated, and the user interface modified according to a present condition. In some cases, the presentation relating to an event need not be continuous. That is, as a result of presentation to the user, the cost function is modified, and the event is not again represented until the cost function exceeds the presentation threshold. The change in cost function may indeed be purely a function of time, or take into consideration dynamically changing variables. For example, if a traffic jam is ten minutes ahead on the road (using predicted travel speeds), and there are a number of opportunities within the path leading toward the traffic to circumvent it, the urgency of taking a detour is low. As the time until the traffic decreases, or as the last opportunities for detour are approaching, any decision by the user become critical. This required decision is, in this case, the risk. On the other hand, the traffic may be caused by a traffic light or other temporary obstruction. Therefore, the reliability of the risk indication will depend on an analysis of the surrounding circumstances and the likelihood that the predicted risk will be the actual risk. Time, in this case, is not clearly independent of the other factors, and therefore need not represent an independent output to the user. It is noted that such analysis of risk and reliability may be facilitated by a wavelet domain transform, which need not be a discrete wavelet transform (DWT), although the binary decomposition properties of this transform may prove convenient or advantageous in various circumstances. In particular, the purpose of the transform is not necessarily a storage or computation-efficient representation; rather, the purpose is to significantly separate degrees of freedom to simplify the statistical and probabilistic analysis. It is also noted that the particular wavelets may be complex, high dimensionality, asymmetric functions, and need not be wavelets of a traditional kind used in image compression.

[0711] It may also be useful to transform the data into various domains, such as time, frequency, wavelet, alternate iterated function system, or the like, for filtering and denoising. Preferably, adaptive thresholds are employed, although in many instances the filtering may be performed in a context-independent manner. On the other hand, where appropriate, the filtering may be context sensitive, that is, the modifications of the data set during the filtering are dependent on a calculated risk, reliability, or relevance, or other parameter. Further analysis may be performed either in the transform domain, inverse transform to the original representation, or using a different transform.

[0712] It is also possible to employ a fractal (iterated function system) analysis and/or transform of the data. In this case, a function within a space, of any dimensional order, is decomposed into a representation of a set of components,

which may include continuous functions (wavelet) or discontinuous functions (geometric shape), each of which may be translated, scaled only any axis, and amplitude scaled. Indeed, where convenient, the function within a space may be decomposed into a plurality of separate representations. Thus, according to one example, a number of feature-specific decompositions may be applied where appropriate. In the case of non-linear functions, it may be possible to decompose the function into a linear component and a non-linear component, wherein a relatively simplified non-linear component may be subjected to a type-specific analysis. Thus, it is understood that even relatively complex and seemingly intractable problems may be addressed. It is further noted that incalculable aspects of a fact or predicate net may be represented within the context of a reliability variable. As such, a network is analyzed, and to the extent possible, numeric analysis applied to reduce the result to low-dimensionality terms. The predicted magnitude or potential magnitude of the residual function or the uncertainty bounds may then be estimated, resulting in a contribution to the reliability output. Of course, the reliability estimate need be limited to unknowns, and may also represent a contribution from an analytical technique which produces a calculated uncertainty.

[0713] In a typical process, a data set, which may include a plurality of dimensions, is first processed to reduce noise. For example, error correction and detection algorithms may be applied to eliminate spurious data or correct data which has been corrupted. This process may also include a subprocess for eliminating intentional spurious data, for example, data communicated by a malfeasant, or data generated automatically in a random or pseudorandom manner to make the entire dataset suspect as a source of incriminating evidence. This is discussed in more detail, below. The data may also be filtered or denoised using one or more various algorithms, especially where the data is obtained continuously from local sensors. Preferably, one or more model-based algorithms is employed to optimally process data or portions of data. This later function may be consolidated with a feature extractor to correlate data with patterns which likely indicate a known event, to classify the signal. A multidimensional hidden Markov tree (HMT) analysis may be used to process the data. A known principal component analysis (PCA) may, for example, precede the HMT, to reduce the dimensionality of the data matrix by extracting the linear relationship between the variables and decorrelating the cross correlation in the data matrix. The hidden Markov tree is a statistical model governing the wavelet coefficients, and exploiting its tree structure in the time-frequency domain. Each wavelet coefficient is modeled as a Gaussian mixture with a hidden state variable. See, Detection and Classification of Abnormal Process Situations Using Multi-dimensional Wavelet Domain Hidden Markov Trees (Nov. 9, 2000), Amid Bakhtazad, http://www.chem.eng.usyd.edu.au/events/poster_2000/present6/ppframe.htm

[0714] In order to prevent a data transmission from being used as self-incriminating evidence, steps may be taken to undermine the reliability of any single piece of data within a data set. In the former case, a random or pseudorandom process may be used to corrupt the database. This may take the form of modifications of existing records and/or generation of phantom records. Typically, such corruptions are made in such manner that a corresponding filter in a receiving unit, with high reliability, will be able to “uncorrupt” tile data. However, without knowledge of the actual corruption parameters, which are not transmitted, the reconstruction is statis-

tical and not lossless. Therefore, with high reliability, the content of the database is communicated, but not in such manner that anyone could opine that individual data within the database is real. For example, a database with GPS and chronology will necessarily include data which may be used to derive the speed of the vehicle. When that speed is in excess of the speed limit, a transmission or retention of the data may be used as an admission of transgression of speed limit laws. Using a known filter scheme implemented at the receiver, an algorithm at the transmitter may operate on the data to corrupt that data in such manner that the receiver will correct the data. By applying a low parameter at the transmitter, the reliability of the received data can be controlled. The transmitter may, for example, determine that 25% of the data is to be corrupted, and 1% corrupted in such manner that the receive filter does not accurately reconstruct the data. However, the corrupt 1% may be distributed such that 99% is flagged as spurious, based on, for example, excess or negative speeds, non-monotonic travel, etc. Thus, 0.01% of the corrupt data is conveyed without being caught, a statistic which is likely less than other, non-intentional corrupting influences. Each of these parameters may be independently controlled at the transmitter. Likewise, it is even possible for these corrupting parameters to be transmitted, alerting the receiver that the data may be suspect. Again, since these are statistical processes, no single data point would have evidentiary reliability.

[0715] Using various cryptographic techniques, such as public key infrastructure (PKI), it may also be possible to secretly synchronize the internal filters of the communicating devices, to maintain high reliability of user alerts, while masking the data itself. Thus, using secure hardware and appropriate software techniques, all or most of the corruptions may be corrected or eliminated. For example, the transmitter uses a pseudorandom noise generator to control a corruption of data to be transmitted. Information related to the cryptographic key used to initialize the pseudorandom noise generator is securely conveyed to the receiver, for example using a Kerberos or other type of cryptographic key negotiation. The receiver then initializes its own corresponding pseudorandom noise generator to generate a synchronized stream, allowing it to decorrupt the data. Clearly, various techniques, including those known in the art, may be combined to remedy weaknesses of any given scheme. Preferably, a plurality of different algorithms are available, should one or more prove broken.

[0716] See, Matthew Crouse and Robert Nowak and Richard Baraniuk, "Wavelet-Based Statistical Signal Processing Using Hidden Markov Models", Proceedings ICASSP-97 (IEEE International Conference on Acoustics, Speech and Signal Processing), IEEE Transactions on Signal Processing, 1997, and cited references, expressly incorporated herein by reference. See, also, B. Vidakovic, Wavelet-based nonparametric Bayes methods, Technical Report, ISDS, Duke University., Merlise Clyde, and Heather Desimone and Giovanni Parmigiani, Prediction Via Orthogonalized Model Mixing, Journal of the American Statistical Association, 91(435):1197 (1996); Katrin Keller, Souheil Ben-Yacoub, and Chafic Mokbel, Combining Wavelet-domain Hidden Markov Trees with Hidden Markov Models, IDIAP-RR 99-14 (1999), expressly incorporated herein by reference. See, also, Attoor Sanju Nair, Jyh-Charn Liu, Laurence Rilett and Saurabh Gupta, "Non-Linear Analysis of Traffic Flow," the 4th International IEEE conference on Intelligent Trans-

portation systems, Oakland Calif., Aug. 25-29, 2001, (accepted), expressly incorporated herein by reference.

[0717] In like manner, additional dimensions of analysis may be added, resulting in further modifications of a cost function.

[0718] Urgency is a subset of relevance. Relevance may also be treated as an independent factor; that is, not included within risk or reliability. For example, a fact representing a risk may be known with high certainty, for example, a weather condition on a road: this fact, however, has low relevance if the car is parked in a covered garage. Thus, according to an aspect of the invention, the relevance may be considered an independent variable. Typically, in this case, the risk and reliability are together analyzed to determine a cost function; the cost function is then filtered using a relevance criteria (which, for example, produces a modified cost function), and typically sorted or ranked by weight. This relevance therefore replaces a simple threshold with respect to making ultimate decisions regarding information presentation to the user. Relevancy may be determined by explicit input from the user, implicit user input, collaborative processes, statistical analysis of other user under like circumstances, or the like. It is noted that the cost function may be personalized for each user.

[0719] In some cases, a dimensionless cost function is too simplistic, and leads to results which fail to convey useful information to the user; in those cases, sets of outputs may be presented based on one or more criteria, or an estimated composite function. Therefore, it is understood that a complex "cost function" or utility function, resulting in an output having various degrees of freedom, may be employed.

[0720] Preferably, the system according to the present invention is integrated with a vehicular telematics system, thus providing access to various vehicle data, in addition to environmental data. However, it is not so limited, and may be used in any type of man-machine interface wherein complex data is to be presented to a user for human consideration.

[0721] It is noted that, in some instances, a fact or predicate set may possibly represent a plurality of different events. In this case, it may sometimes be useful to group these events together. This is particularly the case if the nature of the alert and likely response to the alert by the user is similar, regardless of the particular event giving rise to the sensor readings. In that case, the risks, reliabilities, and relevance are aggregated in an appropriate fashion, for example vector summed or composite magnitude, and an aggregate cost function output, along with a generic alert. This generic alert may then be subdivided into its components, for example in a lower-hierarchical level user interface output. In this manner, a set of possible events, none of which would exceed an alert threshold individually, may together exceed the threshold and indeed receive a high ranking.

[0722] Another way of analyzing this situation is that the system may analyze the available data at a number of hierarchical levels. At each level, the risk, reliability and optionally relevance is determined, and the result stored. The user interface may then select events based on redundancy and generic alerts, superceding the particular ranking of events at a homogeneous level of analysis. For example, data indicating stopped traffic ahead may be consistent with an accident, stop light, or construction. These may be divided into normal events (with low risk) (traffic light) and abnormal events (with high risk) (accident or construction). The former would not generally issue an alert, unless a suitable bypass is available that would be efficient. The later, on the other hand, would

likely generate an alert. The available information may not be able to distinguish between an accident and construction, and indeed, the individual probabilities of these may be insignificant. However, together, the probabilities may be significant. Likewise, since these are two alternative, generally inconsistent possibilities, the reliability of each will be greatly reduced. Grouped together, however, their joint reliability is estimated to be about the remaining likelihood after the traffic light is accounted for, with high reliability. With respect to relevance, each of these events would have similar relevance, which would be high, assuming the stopped traffic is along the itinerary of the vehicle. Thus, a composite alert of “abnormal stopped traffic 1 mile ahead; reliability 33%” would be a useful compromise to maintain an efficient user interface while conveying the useful information. Of course, the underlying system should generally still compute the probabilities, reliability and relevance for each possibility, since this analysis may yield more useful information and provide better guidance to the user.

[0723] The ranking may, for example, employ a combinatorial analysis of a set of rankings based on a self-consistent probability-weighted utility of each event within a ranked set. That is, if various events are mutually inconsistent, then a ranking is limited by a presumption of the existence of one event, and competing hypotheses are established as different rankings. In a rigorous sense, the utility may be determined by a mathematical integration of the appropriate function, although in many instances either the data will be represented as a field which can be simply summed, or simplifying presumptions may be applied to make the evaluation tractable.

[0724] According to an aspect of the invention, a user transmits a relevance or cost function to corresponding other users, which then calculate the most useful information to transmit based on the circumstances of the intended recipient. Likewise, a plurality of users may exchange their respective relevance or cost functions. This relevance or cost function is, for example, a current position, immediate itinerary, and any other particular relevance factors. Such other factors might include heavy load, urgent transit, travel preferences, or the like. Upon receipt, the device of the other corresponding user then calculates relevance and/or cost functions using its local data set based on the received parameters. This calculation is then used as a filter to determine a priority of data to be transmitted. As the time available for transmission grows, the amount of information transmitted may be complete. For example, two cars traveling adjacent on a highway or parked near each other may conduct a complete data exchange. When optimizing the broadcast of data based on a plurality of user's relevance or cost functions, a weighting may be applied which balances the maximum good for the many with the urgent needs of the few. Likewise, accommodations may be made for anticipated duration of communication for the respective users, and the availability of packet forwarding and secondary retransmission.

[0725] Since all devices share a common transmission medium, it is generally useful to compute a cost function for use of the shared medium as well, allowing peers access to the medium after the marginal utility for the current user has declined. Access to the shared medium may also be allocated on a round robin basis, especially when demand is highest. Each device preferably monitors all local transmissions, since these will likely include data of some relevance to each device. Likewise, by monitoring such transmissions, one device may make presumptions as to the state of the local

database of another device (especially given a knowledge of its present position and path), and therefore avoid redundant transmissions of data. Likewise, in such a peer to peer network, a voting scheme may be instituted, allowing the peer with the “best” data, i.e., the data which is most reliable, most accurate, most recent, most detail, or other criteria to transmit with higher priority.

[0726] Known packet data broadcast protocols may be used to convey the information. Likewise, known peer-to-peer techniques and protocols may be used to communicate, or control communications, between peers.

[0727] According to another aspect of the invention, a user may broadcast or transmit a specific query for information, using as at least a part of the query a relevance or cost function. Recipients of the broadcast or transmission then execute a search of their database based on the received query, and respond accordingly. This query may be a broad or narrow request for information, and thus need not result in a complete exchange of data.

[0728] In order to optimally allocate communications bandwidth, users within an area may engage in a local auction, that is, each user bids for use of the shared medium, with those deferred and the supplier of information receiving credits. An accounting for these credits may, for example, take place each time a device connects with a central database, for example, using a “hotspot” or other access to the Internet. These credits may, for example, be converted into economic values. In like manner, advertisers may also bid for access to users, with users, for example, receiving credit for receipt of advertising. Such bidding may be on an individual or group basis. Typically, advertising will be relevant, for example as a location-based output, but need not be.

[0729] It is also possible to conduct auctions or otherwise account for control of the communications medium using a zero-sum temporal averaging. That is, each user has an a priori equal right to access. As a user takes advantage of that access, its rights decrease, until exhausted. Over time, rights are added, and accrued rights expire. For example, rights may have a half-life of 5 minutes, with a regression to a predetermined value. As more users compete for control over the medium, cost increases. Suppliers of information may receive partial credits from the consumer. Value transmission may take place using a modified micropayment scheme, for example a variant of Agora Micropayment Protocol, “Agora: A Minimal Distributed Protocol for Electronic Commerce”, Eran Gabber and Abraham Silberschatz, Bell Laboratories or MPTP, Micro Payment Transfer Protocol (MPTP) Version 0.1, W3C Working Draft 22 Nov. 95, www.w3.org/pub/WWW/TR/WD-mptp-951122.

[0730] Thus, within a cell, each user is a primary recipient, a secondary recipient, a supplier, or undefined. A primary recipient bids for access and control of the medium, i.e., the communications band. This bid takes the form of a cell identification (i.e., the controlling user's location and itinerary), as well as an economic function representing the required information and valuation thereof by the user. The bids are broadcast and each recipient calculates an actual value for the bid using its own database and the relevance function. The calculated economic values, filtered by the recipient databases, are then broadcast, and the highest actual valuation is deemed winner. A negotiation then occurs between the bidder and the holder of the valued information, for payment for the transmission, and other bidders receive a lesser value as a concession. Secondary recipients of the information also pay for the

information, based on their respective bids, with a redistribution to the other bidders as a concession. Devices which are not active bidders have no economic effect, although these may accumulate and use transmitted information from others. Thus, an economic redistribution occurs efficiently, while optimally allocating scarce bandwidth.

[0731] In general, the auction parameters may be too complex for interactive user entry. Rather, the user cost function itself represents the user valuation, and therefore is usable as a bidding function. In the cost function, both subjective and objective values are observed. With respect to objective values, the relationship of a user context and an event known by the recipient provides a relevance, and therefore the objective valuation. This objective valuation is then warped by user subjective factors. Some users may be quite willing to pay more for a better quality of service. At least a portion of this value is distributed to other users, this system allows even those with low valuation to access the network, since these deferred users will accumulate credits. In some cases, the credits may be provided with cash value (i.e., an ability of a user to extract cash proceeds from the system), while in other cases, these credits are limited to use with the system, with no redemption rights. The use of a central authority for the purchase of usage credits therefore allows a profit incentive for the authority responsible for the system. A user may therefore express a higher valuation by purchasing units from an authority, or by providing value to other users of the system, which may, for example, require enhanced hardware purchases to include more and/or better sensors of various conditions.

[0732] A negotiation or auction may also include external elements, such as fixed infrastructure. In this case, the scarce resource is, for example, the right of way. Elements of the fixed infrastructure which are subject to negotiation include traffic lights, draw bridges, railroad crossings, etc. Typically, such infrastructure systems have low intelligence. By employing communications with interested parties, a more efficient outcome may be predicted as compared to “fair”, though unintelligent decisions. Thus, competing drivers may bid for a right of way or green light. The traffic signal may be arbiter of the negotiation, or merely recipient of the defined result. In some instances, the negotiation is free of cost, for example, a traffic light with but one car approaching and no hazards surrounding. In this case, the signal allows the driver to pass, unobstructed. In another instance, a large amount of traffic may be present, seeking to pass through an intersection. All of the vehicles seeking to pass present “bids” for the right, with bids representing common interests or outcomes pooled. The aggregate bids are then compared for action. In this case, the transaction may have no economic impact, but rather the utility functions may be relatively non-subjective. For example, emergency vehicles may have a non-subjectively determined high valuation, cars driving toward the intersection with a present state of traffic flow control in their favor at a medium valuation, and stopped traffic with a low valuation. As the duration of the stop increases, a delay factor increases the valuation for the stopped traffic to compensate, allowing or forcing the signal to change. The objective criteria used in this circumstance (which may, for example, be defined by a municipality or traffic engineer) may include optimization of pollution, energy efficiency, effects of traffic flow on other intersections, speed control, and other considerations.

[0733] It is noted that, since external elements communicate using the same communications system, and indeed various communications systems may share the same band, the concept of bidding for use of the shared or scarce resource may transcend a given communications purpose, and, other than communicating using a common protocol for the bidding and auction process, other users of the band need not communicate public information.

[0734] A user may also provide a subjective element to a context, for example, a driver may be in a rush or be late for a meeting. This may be explicitly input by the user, as a factor which adjusts the cost function higher, or may be derived implicitly from observation of user behavior. Likewise, a driver may be in no particular rush, and therefore place a low relevance to information which might be of particular benefit to allow him to travel faster.

[0735] Thus, in a purely fair system, each user is allocated a “fair” chance for access to the scarce bandwidth resource, and bids using equally distributed credits to compensate those users deferred, and particularly those users who provide useful information. A user bids using a cost function, representing the maximum value of the resource to that user. Using known auction theory, for example, the cost to the winning bidder may be the price bid by the second-highest bidder. Of course, other known auction types may be employed. The cost function may be automatically generated by a user based on available funds, likely future required use of the funds, a relevance or context which allows for adaptive bidding based on the value of the information to be provided, and user-subjective factors. The actual normalized bid is resolved by the respective recipients, which then broadcast the results. The maximum value bidder then controls the scarce bandwidth resource until the bid-for communication is completed or exhausted. In order to avoid inefficient reauction overhead, a periodic auction may be conducted, with all bidders placed in a queue.

[0736] Clearly, in real world situations, a number of additional distortions will take place. Bidders may become unavailable prior to completion of a communication. Interference may require retransmission.

[0737] As discussed above, each “limited resource” may be subject to auction. Preferably, a spatial division multiplexing scheme is employed, wherein each band has one or more frequency channels. High gain, directional antennas are employed, such that there is a high degree of frequency reuse within a local area. However, there will be a statistical degree of competition for the frequencies. In addition, there will be competition from other competing uses for the band, which may also engage in an auction scheme for access. Typically, by efficiently negotiating an auction between all users of the resource (i.e., the overhead for negotiation is negligible as compared to the actual usage), overall throughput and capacity will be increased.

[0738] For example, each system may include 8-16 transceivers or the ability to conduct 8-16 communication sessions simultaneously. In the former case, 8-16 directional antennas having relatively low overlap are arrayed in different directions, providing a physical separation. In the later case, a phased array or synthetic aperture antenna system electronically defines 8-16 independent apertures, also with low overlap. Each spatial domain aperture and its associated coverage area represents a different resource which may be allocated. Therefore, multiple simultaneous negotiations may occur

simultaneously. Each aperture may be a separate radio, with packets routed there-between, or the radios may be coordinated.

[0739] It is also noted that the communications system may be used not only for packet data communications between peers, but also as a real time communication system for data streams, such as voice communications. In this case, hand-offs may be necessary between various nodes in order to assure continuous end-to-end communications. Such hand-offs and multiple hop communications may be predicted in advance and pre-negotiated. Such communications predictions may, indeed, involve multiple systems, such as various cellular carriers and protocols, 802.11 hot spots, and a mobile ad-hoc network with sporadic links to fixed infrastructure. This, in turn, allows a balancing of competitive uses for the resources, quality of service, cost, and For example, by providing a mobile ad-hoc supplementation for a fixed cellular infrastructure, the incidence of dropped calls and service unavailability may be reduced. Likewise, cellular carriers may allocate their infrastructure build-outs and capital investments where the return on investment will be maximum. On the other hand, cellular users in such regions may employ other users to act as repeaters for extending the effective range of their equipment. In this case, the compensation and/or negotiation therefore for use of the system may come, in whole, or in part, from the fixed infrastructure provider. On the other hand, if the system is sponsored by the fixed infrastructure carrier, then the repeater services hosted by each node may be at no incremental cost to the fixed service provider.

[0740] This later possibility provides an interesting opportunity. Since the fixed cellular infrastructure providers generally own licensed spectrum, the implementation of repeater or ad hoc services between mobile units may be coordinated centrally, with mobile-to-mobile communications using cellular channels, which may be time domain (TDMA), frequency domain (FDMA), code division (CDMA and related systems), or other type of band-sharing scheme in accordance with the more global standards generally established for these services. Typically, mobile-to-mobile communications use omnidirectional antennas, and packet data communications may use excess system capacity, e.g., capacity not presently being used for voice or other toll or real-time service. The fixed infrastructure may also provide coordination of information communication services, local buffering, and multicast information of general interest.

[0741] It is therefore clear that the present invention may comprise both disruptive and incremental technologies, and the underlying business model may therefore be modified to suit.

[0742] A particular issue which is advantageously addressed during the design phase is the security of the system against “hackers” or malfeasants. This may be dealt with by providing a central database of authorized users, with peer reporting of accounting and apparent abuse. If a user is suspected of abuse, its access rights may be extinguished. This, in turn, will at least prevent the user from engaging in auctions, and, if transmissions are encrypted or otherwise secure, may prevent eavesdropping on normal communications streams. This same result may be imposed on a user who exhausts his credits, although it is preferred that a user who is otherwise in compliance with normal regulations be permitted to receive communications and indeed to gain new credits by transmitting useful information.

[0743] Since the system is a packet data system, similar to in many respects, and possibly an extension of, the Internet, various known Internet security paradigms may be applied and employed.

[0744] While it is often useful to engage in fair auctions or games, it is also possible to engage in unfair auctions. For example, since there may be external financial requirements for maintenance of the system, these may be paid by subscription fees, or subsidized by advertisers. The advertiser may transmit its own cost function, and bid for presentation to given users, or engage in a broadcast for all users. In this case, more valuable users will gain more credits, and therefore have more control over the network. This is not “fair”, but the distortions implicit in this technique may be tolerable. Likewise, a bidder may purchase credits, but typically this purchase will be consumed by the service operator, and not paid to the users as a whole. However, presumably, this will on the whole reduce normal service pricing for all users. Indeed, various promotional techniques may be used to distort allocation of bandwidth, without departing from the general scope of the invention.

[0745] It is noted that this implicit auction process, wherein a user bids a utility function rather than a normalized economic value, is a distinct part of the invention, applicable to a plurality of contexts and environments, well beyond telematics. Likewise, the concept of bidding for quality of service to control a shared resource, against competing users, is also applicable to other contexts, notably peer-to-peer networks, other shared transmission medium networks, and queues.

[0746] In order to define a user’s subjective preferences, value functions, and the like, a number of methods may be employed. Certainly, express and explicit inputs may be received from a user. Likewise, a user model may be constructed by observation of the user. A user may be classified as a member of a group having common preferences, and then the preferences associated with the group may serve as a proxy for the user himself. This is called a collaborative profile, the basis for a collaborative filter. In order to classify a user into a group, personality tests and/or common attributes may be employed. According to a particular aspect of the invention, a user may be classified by game play. By using game theory, irrational or subjective user biases. By using games, a user’s utility function or valuation may be assessed. Likewise, risk tolerance and demand for immediate gratification can be determined. Further, game theory in the form of wagering may also assist in determining economic normalizations. Games, especially with the results augmented by collaborative profiling, may through a limited number of iterations, elicit relatively detailed information. Indeed, through inter-relation with commercial sponsorship (or state associated lotteries), the economic incentives and risks of the game may be made quite real.

[0747] In communicating data to another communications device, typically it is desired to transmit (or exchange) all of the memory or all of a “public” portion of the memory, with the received information sorted and processed by the receiving unit and relevant information persistently stored in the memory. After exchange, conflicts may be resolved by a further exchange of information. An error detection and correction (EDC) protocol may be employed, to assure accurate data transmission.

[0748] Since the communication bandwidth is necessarily limited, and the communications channels subject to noise and crowding, it is often important to prioritize transmissions.

It is noted that, without a complete communication of the memory, it is difficult to determine which events a communications partner is aware of, so that an initial communication may include an identification of the partners as well as recent encounters with other partners, to eliminate redundant communications, where possible. Vehicles traveling in the same direction will often be in close proximity longer than vehicles traveling in opposite directions. Further, the information of relevance to a vehicle traveling in the same direction will differ from the information of relevance to a vehicle traveling in the opposite direction. Thus, in addition to an identification of the communications device, the recent path and proposed path and velocity should also be exchanged. Based on this information, the data is prioritized and sorted, formatted and transmitted. Since the communications channel will likely vary in dependence on distance between partners, the communications protocol may be adaptive, providing increased data rate with decreasing distance, up to the channel capacity. Further, when the vehicles are relatively close, a line-of-sight communications scheme may be implemented, such as infrared (e.g., IRdA), while at larger distances (and/or for all distances) a spread spectrum 915 MHz, 2.4 GHz or 5.825 GHz RF communications scheme implemented.

[0749] Where multiple communications devices are present within a common communications region, these may be pooled, allowing transmissions from one transmitter to many receivers. In addition, within a band, multiple channels may be allocated, allowing multiple communications sessions. In this case, a single arbitration and control channel is provided to identify communications devices and communications parameters. Preferably, a communications device has the capability to monitor multiple channels simultaneously, and optionally to transmit on multiple channels simultaneously, where channel congestion is low. The channels are typically frequency division. Where such frequency division channels are defined, communications may be facilitated by so-called “repeaters”, which may itself be a mobile transceiver according to the present invention. Preferably, such a repeater unit itself monitors the data stream, and may even process the data stream based on its internal parameters before passing it on.

[0750] In order to assure data integrity and optimize data bandwidth, both forward and retrospective error correction are applied. Data is preferably packetized, with each packet including error detection and correction information. Successful receipt of each packet is acknowledged on a reverse channel, optionally interspersed with corresponding data packets traveling in the reverse direction (e.g., full duplex communications). Where the data error rate (raw or corrected) is unacceptably high, one or more “fallback” modes may be implemented, such as reduced data rates, more fault tolerant modulation schemes, and extended error correction and detection codes. Transmitter power may also be modulated within acceptable limits.

[0751] A central repository of event data may be provided, such as on the Internet or an on-line database. In this case, event information may be administered remotely, and local storage minimized or eliminated.

[0752] Communications with the central database may be conducted through cellular infrastructure, wired or wireless local area network hotspots, or in other communications bands and other communications schemes.

[0753] Where primary event information storage is remote from the device, preferably local storage is based on an itin-

erary (route) and frequently traveled areas, with less frequently traveled and not prospectively traveled routes stored remotely. This allows consolidated update of memory by a large number of sources, with statistical error detection and correction of errant event information. The itinerary information may be programmed in conjunction with a GPS system and mapping/navigation software.

[0754] According to one embodiment of the invention, a plurality of functions are integrated into a single device, a sensor or detector for sensor emissions, for example speed control devices, a human computer interface, a computer system including processor, memory, and operating system, geospatial positioning device, and wireless communication system. Preferably, the system supports accessory inputs and outputs, which may be through wired or wireless means. The human computer interface preferably includes both a graphic display and a natural language (e.g., voice) interface. The computer system preferably possesses sufficient machine intelligence to filter outputs based on relevance and context, as well as interpret inputs as usable commands.

[0755] Data communications over a wireless link, for communicating between vehicles, preferably is highly compressed and fault tolerant. For digital data, this typically requires error detection and correction codes, while for data representing analog information, the information may be encoded such that more important information is transmitted in a more robust manner than less important information. For example, image information may be communicated in a hierarchically compressed manner, with higher order information transmitted in a manner less susceptible to interference and signal fading than lower order information.

[0756] The digital data may be compressed, for example, using a dictionary lookup, run length encoding, and/or model-based vector quantization method. Thus, since transceivers will typically be within 2000 meters from each other, relative position may be relayed in an offset format, with a grid size based on GPS precision and required accuracy, e.g., about 50-100 meters. The encoding may be adaptive, based, for example, on stored map information, with information representation density highest on traveled routes and lower in desolate areas. Thus, a sort of differential-corrected positional coding may be established between units.

[0757] By integrating functions, efficiencies are achieved. Thus, a single central processor, memory, program store and user interface may suffice for all functions. Further, the power supply and housing are also consolidated. While GPS and telecommunication antennas may be maintained as distinct elements, other portions of the system may also be integrated. In a device intended for vehicular applications, the GPS and other functions may be available to other vehicular systems, or the required data received from other systems.

[0758] Communication between communications devices may employ unlicensed spectrum or licensed spectrum, and may communicate between mobile units or between mobile and fixed resources. For example, excess capacity of a traditional cellular system may be used for inter-vehicle communications. Thus, the system may include or encompass a typical cellular (AMPS, IS-136, IS-95, CDPD, PCS and/or GSM) type telecommunications device, or link to an external telecommunications device.

[0759] Even where the cellular telephony infrastructure is not involved, mobile hardware may be reused for the present invention. For example, digital or software defined cellular

telephone handsets may permit programmed use outside the normal cellular system protocols.

[0760] According to the present invention, messages may be passed between a network of free roving devices. In order to maintain network integrity, spurious data should be excluded. Thus, in order to prevent a “hacker” or miscreant (e.g., overzealous police official) from intentionally contaminating the dispersed database, or an innocent person from transmitting corrupted data, the ultimate source of event data is preferably recorded. When corrupt or erroneous data is identified, the source may then also be identified. The identity of the corrupting source is then transmitted or identified, for example to other radios or to a central database, whereupon, units in the field may be programmed to ignore the corrupt unit, or to identify its location as a possible event to be aware of. Further, assuming the hardware of the corrupted unit remains operational, a code may be transmitted to it deactivating it or resetting or reprogramming it.

[0761] Preferably, data is transmitted digitally, and may be encrypted. Encryption codes may be of a public-key/private key variety, with key lookup and/or certificate verification, either before each data exchange, or on a global basis with published updates. In fact, corrupt or unauthorized units may be deactivated by normal and authorized units within the network, thus inhibiting “hacking” of the network. Communications may be metered or otherwise controlled externally, with charges assessed based on usage factors. As discussed above, units may bid for control over the transmission medium, and an accounting may take place either between corresponding units, with a central database, or both. Thus, a subscription based system is supported.

[0762] Techniques corresponding to the Firewire (IEEE 1394) copy protection scheme may be implemented, and indeed the system according to the present invention may implement or incorporate the IEEE 1394 interface standard. The IEEE 1394 key management scheme may be useful for implementing subscription schemes and for preventing tampering.

[0763] One way to subsidize a subscription-based system is through advertising revenue. Therefore, the “events” may also include messages targeted to particular users, either by location, demographics, origin, time, or other factors. Thus, a motel or restaurant might solicit customers who are close by (especially in the evening), or set up transponders along highways at desired locations. Travelers would then receive messages appropriate to time and place. While the user of the system according to the present invention will typically be a frequent motorist or affluent, the system may also provide demographic codes, which allow a customized response to each unit. Since demographic information is personal, and may indicate traveler vulnerability, this information is preferably not transmitted as an open message and is preferably not decodable by unauthorized persons. In fact, the demographic codes may be employed to filter received information, rather than to broadcast interests.

[0764] Commercial messages may be stored in memory, and therefore need not be displayed immediately upon receipt. Further, such information may be provided on a so-called “smart card” or PC Card device, with messages triggered by location, perceived events, time and/or other factors. In turn, the presentation of commercial messages may be stored for verification by an auditing agency, thus allowing accounting for advertising fees on an “impression” basis.

[0765] The communications device may also receive data through broadcasts, such as using FM sidebands, paging channels, satellite transmission and the like. Thus, locationally or temporally distant information need not be transmitted between mobile units. Satellite radio systems may also be integrated.

[0766] While low power or micropower design is desirable, in an automobile environment, typically sufficient power is continuously available to support sophisticated and/or power hungry electronic devices; thus, significant design freedom is provided to implement the present invention using available technologies.

[0767] FIG. 8 shows a block diagram of a communications device embodiment of the present invention. The mobile communications device 1 includes a location sensing system 2, producing a location output 3; a memory 4, for example storing a set of locations and associated events; a telecommunications subsystem 5, for example communicating event and location information between a remote system and the memory 4; and a processor 6, for example processing the location output in conjunction with the stored locations and associated events in the memory 4, to determine a priority thereof.

[0768] The location sensing system 2 may include a known GPS receiver, which produces data that is analyzed by the processor 6. In an alternate embodiment, the GPS receiver includes its own processor and outputs coordinate positions, e.g., Cartesian coordinates, latitude and longitude, to the communications device processor 6, e.g., through a serial port or data bus, such as PC card, Universal serial Bus (USB), Firewire (IEEE 1394), peripheral connect interface (PCI), or other bus, such as that present within an automobile for communication of signals between subsystems. The location sensing system may also determine a position based on the GLONASS system, LORAN, inertial reference, cellular base stations 10', 10", triangulation with fixed radio sources, such as FM radio and television stations, environmental markers and/or transponders, or the like. The location system may also be network based, for example relying on a cellular network to produce georeferenced position information.

[0769] The communications subsystem 5 is, for example, an 802.11g wireless Ethernet local area network system, having a router and switch controlling communications between 8 separate spatially distinct channels, defined by a “smart antenna”. These spatially distinct channels are agile and having an aperture capable of being steered in real time to adjust for a change in relative position and orientation. The router and switch permit forwarding of packets received through one channel to another, as well as local communications control. The radio transceiver 12, operates in the unlicensed 2.4 GHz band, according to FCC regulations for this type of equipment. The system may alternately or additionally communicate in other unlicensed bands, such as 27 MHz, 49 MHz, FRS band, 900 MHz, 5.4 GHz, 5.8-5.9 GHz using various known modulation schemes and data communication protocols. Further, licensed radio bands may also be used, including FM radio sidebands (88-108 MHz), television PRO channel, cellular telephony channels, DECT, PCS and GSM channels, and the like. Likewise, satellite systems 16, 17 may be used to communicate with the mobile communications device 1. Thus, for example, instead of direct communication between mobile units, the existing cellular telephony 10', 10" infrastructure may be used to provide intercell, local, and/or regional communications between units, controlled by cellu-

lar telephone switching processors **11'**, **11''**. These communications may be given a lower priority than voice communications on the cellular telephone network, and therefore may use otherwise excess bandwidth, thus allowing reduced costs and reduced user fees or subscription rates.

[0770] The memory **4** may be of any standard type, for example, one or more of static random access memory, dynamic random access memory, ferroelectric memory, magnetic domain memory (e.g., diskette, hard disk), non-volatile semiconductor memory (e.g., UV-EPROM, EEPROM, Flash, non-standard electrically erasable programmable non-volatile memory), optically readable memory (e.g., R-CDROM, RW-CDROM, R-DVD, DVD-RAM, etc.), holographic memory, and the like. Preferably, common memory devices, such as EDO, SDRAM, RIMM, DDR, are employed, at least for a volatile portion of the memory, allowing simple upgrades and industry standard compatibility.

[0771] While the preferred embodiment includes a radio frequency transceiver for transmitting event data and receiving event data, embodiments are also possible which either transmit or receive the relevant data, but not both. For example, regulations may limit certain transmissions or relevant event sensors, e.g., radar detectors in trucks. In these cases, a receive-only embodiment may be appropriate. Further, while radio frequency communications are preferred, due to their range, data capacity and availability, optical communications systems **13**, e.g., infrared LED's and laser diodes, acoustic communication **15**, passive backscatter communications (employing an RF transceiver such as the spread spectrum transceiver **12**), and the like may also be employed in conjunction or in substitution of a radio frequency system. Optical communication systems **13** may employ various detectors, including optical homodyne detectors, or other coherent optical detectors, or other types of optical sensors, such as PIDs, CCDs, silicon photodiodes, and the like.

[0772] Under some circumstances, a wired or dedicated link between units may be appropriate. For example, a central database **20** may provide consolidated and reliable data. The relevant portion of the database **20** may be downloaded by telephone through a modem **21**, either through a physical connection **23** (e.g., POTS or ISDN, line), through a broadband Internet connect, or other network **24**, to a database server **25**. The memory **4** of the mobile unit may also be uploaded to the central database **20**, after processing by the database server **25**, during the same connection or session.

[0773] Thus, according to the present invention, the public switched telephone network **24** may be involved both during intermittent mass data communications with a central database **20**, and also using, for example, cellular telephony **14**, for the normal operation of the system (e.g., communications between mobile units).

[0774] As discussed above, general access to and control over the communications channel may be arbitrated on a bid and auction basis, as appropriate to avoid contention.

[0775] The processor **6** analyzes the information stored in memory **4** to provide a prioritized output. Thus, the memory may store information relating to a relatively large number of events, without overwhelming the capacity of a human user or communications partner. Priority may be based on a number of factors, including proximity of a stored location to a sensed location or a spatial-temporal proximity of a stored location to a loci of an itinerary **101**, a prospective conjunction **102** of a sensed location with a stored location, a type of event **103**, a type of event and a sensed condition associated with the

mobile communications device **104**, or other factors or a combination of factors. Neural networks, fuzzy logic and/or traditional logic paradigms may also be employed to prioritize the outputs. These logical paradigms are provided in known manner, and, especially in the case of neural network-based systems, a training aspect may be supplied with the system to allow it to adapt to the preferences and capabilities of the user. Thus, for a human user, events which are forthcoming and important are output, while past events and those in the distant future, if at all, are low priority. On the other hand, for communications with other devices, the prioritization is primarily in consideration of the fact that the communication between units may be only short lived; therefore, the data is communicated in order to priority, preferably of the recipient device. In an adaptive device, if the user believes that the information from the device is inappropriate, a simple input is provided, which is later analyzed to alter the information presentation algorithm. Likewise, if an information alert retrospectively turns out to be erroneous in a predictable manner, i.e., relating to a route not taken, the system may internally adjust the algorithm without user input.

[0776] In order to sort the priorities, the intended recipient may, for example, identify itself **201** and communicate its location **202** an itinerary or intended or prospective path **205**. High priority messages **204** and various codes **203** may be interspersed through the communication string. The transmitting unit then outputs data **206** in order of the computed or predicted importance of the event and the time before the recipient encounters the event. Static events, such as fixed location radar emission sources, which may, for example, indicate a source for interference with a radar detector, or a speed detection/control device, may be transmitted as well. In the case where there is contention for the band, the communications session is limited by the scope of the authorization for use of the band. Where there is no contention, the duration of the communications channel will generally control the amount of information communicated.

[0777] Therefore, it is noted that the present invention provides a means for mapping events and for analyzing their significance. Thus, this embodiment does not merely rely on processed sensor outputs to supply information to the user; rather, sensor outputs may be filtered based on past experience with the particular location in question. If a particular user does not have direct experience with a location, then the experience of others at that location may be substituted or combined to improve analysis of the sensor signal. Therefore, the signal analysis from the sensor need not be subjected to a relatively high threshold to avoid false alarms. A low threshold is acceptable because other information is employed to determine the nature of the physical elements that give rise to the event and sensor activation.

[0778] It is noted that, in the case of "false alarms", the response of the unit is to detect the event, e.g., radar signal, correlate it with a stored "false alarm" event, and suppress an alarm or modify the alarm signal. Thus, information stored in memory and/or transmitted between units, may signify an important alarm or a suppression of an erroneous alarm. In this context is apparent that the integrity of the database structure, especially from corruption by the very sources of alarms which are intended to be detected, is important. To the extent that the environment responds to the existence and deployment of the system according to the present invention, for example by detecting transmissions between units to identify and locate units, and thereby alter the nature of an event

to be detected, the present system may also be adaptive, in terms of its function and signature spectral patterns. In one aspect, the system may employ a so-called “FLASH” upgradable memory, which controls system, operation. Therefore, periodically, the system operation may be altered. The communications may selectively occur on a plurality of bands, using a plurality of protocols. Thus, for example, the system may have tri-band capability, e.g., 900 MHz, 2.4 GHz and 5.8 GHz. The mapping feature of the present invention may also be used to identify the locations of such monitoring sites. The system may also mask its transmissions as other, more common types of transmissions or environmental sources of emissions. A direct sequence spread spectrum technique may be employed that is difficult to detect without knowing the spread spectrum sequence seed. Of course, an aspect of the present invention is open communications, which as a matter of course are not securely encrypted and which would identify the transponder and its location. This problem may be addressed, in part, relying on laws which prevent unauthorized eavesdropping and unauthorized interception and decryption of communications, unauthorized “copying” of copyright works and defeating of copy protection schemes thereof, control over availability of authorized transceivers, and patent protection of the design and implementation. According to one embodiment of the invention, channel use and control is established over a first channel, which may be out of band with respect to the normal data communications channel. Preferably, this control channel is longer-range and more robust than the data communications channel, permitting control to precede normal communications capability, and providing enhanced recovery and network reconfiguration capabilities.

[0779] According to one embodiment, all communications are direct sequence spread spectrum over a wide band, with medium to high security codes, e.g., 10 bits or greater length chip sequence and 12 bits or greater data encryption, and more preferably 16 bit or greater chip sequence and 16 bit or greater data encryption. The chip sequence of the control and arbitration channel, which should be available to all compatible units, may be adaptive or changing, for example following a formula based on time, location, and/or an arbitrary authorization code provided with a subscription update. Further, the chip sequence may vary based on selective availability (SA) deviances in GPS data, or based on the identity of satellites in view of the receiver. While such information might be available to “pirates”, miscreants, hackers and scofflaws, the algorithm for generating the chip sequence might be held as confidential, and thus the system unusable without specific authorization and incompatible with equipment without such algorithm. Such systems employing secure encryption with open access have been employed in satellite television (General Instrument VideoCipher II) and the like. It is noted that, in order to mask a message in a spread spectrum signal, multiple active channels may be employed, one or more of which transmits the desired data and the remainder transmitting noise or masking data.

[0780] Employing 2.4 or 5.8 GHz communications bands, data rates of 10 megabits per second (MBPS) are possible, although lower rates, such as 0.5-1.0 MBPS may be preferred to reduce loss due to interference or adverse communications conditions and maintain availability of simultaneous communications on multiple channels within the band in a small geographic area.

[0781] Where mobile devices are traveling parallel and at similar speeds, or both are stopped, an extended communications session may be initiated. In this case, the data prioritization will be weighted to completely exchange a public portion of the database, although emphasis will still be placed on immediately forthcoming events, if anticipated. On the other hand, where computed or user-input trajectories indicate a likely brief encounter, the immediate past events are weighted most heavily.

[0782] In order to analyze temporal or spatial relevance, the memory 4 preferably stores an event identifier 301, a location 302, a time of detection of an event 303, a source of the event information 304, an encoding for a likely expiration of the event 305, a reliability indicator for the event 306, and possibly a message associated with the event 307 including other information. These data fields may each be transmitted or received to describe the event, or selectively transmitted based on the nature of the event or an initial exchange between units specifying the information which will be communicated. Other types of relevance may also be accounted for, as discussed above.

[0783] For example, in a radar detector embodiment, mobile police radar “traps” are often relocated, so that a particular location of one event should not be perpetuated beyond its anticipated or actual relevance. In this case, expirations may be stored, or calculated based on a “type” of event according to a set of rules. False alarms, due to security systems, traffic control and monitoring systems, and the like, may also be recorded, to increase the reliability any warnings provided.

[0784] Likewise, traffic jams often resolve after minutes or hours, and, while certain road regions may be prone to traffic jams, especially at certain hours of the day and/or days of the week, abnormal condition information should not persist indefinitely.

[0785] The preferred embodiment according to the present invention provides an event detector, which, in turn is preferably a police radar 18 and LIDAR 19 detector. Other detected events may include speed of vehicle, traffic conditions, weather conditions, road conditions, road debris or potholes, site designation, sources of radio signals or interference or false alarms for other event detectors, and particular vehicles, such as drunk drivers or unmarked police cars (possibly by manual event input). The event detector may include, for example, a sensor, such as a camera 26, which may analyze traffic control indicia (such as speed limits, cautions, traffic lights). The event may also include a commercial message or advertisement, received, for example from a fixed antenna beside a road, which, for example, is stored as the message 307. Such a commercial message 307 may be presented immediately or stored for future output. The received message, whether commercial or not, may be a static or motion graphic image, text or sound message. The user output of the system 27 may thus be visual, such as a graphic or alphanumeric (text) display, indicator lights or LED's 28, audible alerts or spoken voice through an audio transducer 29.

[0786] The camera is, for example, a color or infrared charge coupled device (CCD) or complementary metal oxide silicon field effect transistor (CMOS) imager, having resolution of 0.3 to 6.0 megapixels. Image communication may be, for example H.261 or H.263+, using H.323 or H.324 protocol, or MPEG-4. The imager may also be incorporated as part of a mobile videoconferencing system, although a dual imager system (one for imaging persons and the other for imaging

road conditions) may be implemented. Other ITU standards, e.g., T.120, may be employed for data communications, although the particular nature of the data communications channel(s) may compel other communications protocols.

[0787] In order to maintain the integrity of the database stored in memory 4, 20, it may be useful to store the originator of a record, i.e., its source 304. Thus, if event information from that origin is deemed unreliable, all records from that source may be purged, and future messages ignored or “flagged”. As stated above, even the proximity of an unreliable or modified unit may be detrimental to system operation. Therefore, where the location of such a unit is known, other units in proximity may enter into a silent mode. Further, normal units may transmit a “kill” message to the unreliable unit, causing it to cease functioning (at least in a transmit mode) until the problem is rectified or the unit reauthorized.

[0788] The unit is preferably tamper-proof, for example, codes necessary for unit activation and operation are corrupted or erased if an enclosure to the unit is opened. Thus, techniques such as employed in the General Instrument VideoCipher II and disclosed in Kaish et al., U.S. Pat. No. 4,494, 114, may be employed.

[0789] The communications subsystem preferably employs an error correction/error detection protocol, with forward error correction and confirmation of received data packet. The scheme may be adaptive to the quality of the communication channel(s), with the packet length, encoding scheme, transmit power, bandwidth allocation, data rate and modulation scheme varied in an adaptive scheme to optimize the communication between units. In many cases, units engaged in communication will exchange information bidirectionally. In that case, a full duplex communication protocol is preferred; on the other hand, where communication is unidirectional, greater data communication rates may be achieved employing the available bandwidth and applying it to the single communication session.

[0790] In some instances, it may be desired to maintain privacy of communications. In that case, two possibilities are available; spread spectrum communications, preferably direct sequence spread spectrum communications is employed, to limit eavesdropping possibilities. Second, the data itself may be encrypted, using, for example, a DES, PGP, elliptic keys, or RSA type encryption scheme. Keys may be supplied or exchanged in advance, negotiated between partners, or involve a public key-private key encryption algorithm. For example, the spread spectrum communications chip sequence may be based on an encrypted code. Ultrawideband (UWB) communications techniques may also be employed.

[0791] In order to provide flexibility in financing the communications devices, the commercial messages 307 discussed above may be employed. Further, by circulating authorization tokens or codes 203, a subscription service may be provided. Thus, in a simplest subscription scheme, the communications device has a timer function, which may be a simple clock or GPS referenced. The user must input an authorization code periodically in order for the device to continue operating. Thus, similarly to satellite television receivers and some addressable cable television decoders, failure to provide the authorization code, which may be entered, e.g., by telephone communication or through a keypad 30, renders the device temporarily or permanently inoperative. In order to reduce the burden of reauthorizations, the authorization codes or tokens may be passed through the

communications “cloud” 24, so that devices 1, if used, will eventually receive the authorization data. Conversely, a code 203 may be circulated which specifically deactivates a certain device 1, for example for non-payment of the subscription fee or misuse of the device (e.g., in an attempt to corrupt other users databases). The authorization process is preferably integral to the core operation of the system, making bypassing authorization difficult.

[0792] Where a number of communications devices are in proximity, a multi-party communication session may be initiated. For example, the communications subsystem may have simultaneous multi-channel capability, allowing each unit to transmit on a separate channel or use a shared channel. Where the number of channels or channel capacity is insufficient, units may take turns transmitting event information on the same channel (e.g., according to estimated priority), or time division multiplex (TDM) the channel(s). Preferably, the communication scheme involves a number of channels within a band, e.g., 1 common control channel and 24 data communications channels. Since some communication sessions may be relatively short, e.g., limited to a few seconds, a data communications channel preferably has a maximum capacity of tens of kilobits per second or higher. In some cases, hundreds of kilobits, or megabit range bandwidths are achievable, especially with a small number of channels (e.g., one channel). For example, so-called third generation (3G) cellular communications protocols may be employed.

[0793] Thus, for example, a DSSS spread spectrum transceiver operating in the 2.5 GHz band might have a usable bandwidth of 10 megabits per second, even while sharing the same band with other transceivers in close proximity. Where necessary, directional antennas or phased arrays may be employed to provide spatial discrimination.

[0794] The system preferably has advanced ability to detect channel conditions. Thus, where communications are interrupted by physical limitations in the channel, the impairment to the communications channel is detected and the communications session paused until the impairment abates. This, in turn, will allow other units, which might not be subject to the impairment, to use the same channel during this interval. The channel impairment may be detected by a feedback protocol between communications partners, or by means of symmetric antennas and communications systems, by which an impairment of a received signal may be presumed to affect the transmitted signal as well. The latter requires a high degree of standardization of equipment design and installation for effectiveness.

[0795] It is particularly noted that, where the events to be detected and the communications subsystem operate in the same band, structures may be shared between the communications and event detection systems, but this also increases the possibilities for interference.

[0796] As one embodiment of the invention, the processor may be provided as a standard personal digital assistant (PDA) with a PC Card or PCMCIA slot for receiving a standard GPS receiver and another standard PC Card slot for receiving an 802.11b/g/a/a R/A module. The PDA, in turn has memory, which may include random access memory, flash memory, and rotating magnetic memory (hard disk), for example. The PDA has a processing system which is capable of running applications written in general purpose, high level languages such as C. The PDA may operate under a standard operating system, such as Microsoft Windows CE, Palm OS, Linux, or a proprietary operating system. A software appli-

cation written in a high level language can normally be ported to run in the PDA processing system. Thus, the basic elements of the hardware platform are all available without customization. In a preferred embodiment, an event sensor is provided, such as a police radar and laser speed detection equipment system (e.g., “radar detector”) is provided. This may employ a modified commercially available radar detector, to produce a serial data stream or parallel signal set. For example, radar detectors providing an alphanumeric display often transmit data to the display controller by means of a serial data signal. This signal may be intercepted and interfaced with a serial port or custom port of the PDA.

[0797] Optionally, the GPS Smart Antenna is “differential-ready” to apply differential GPS (DGPS) error correction information to improve accuracy of a GPS determined location. The application program for the PDA may be provided in a semiconductor memory cartridge or stored on hard disk.

[0798] The PDA 30 includes the processing system, including a microprocessor, memory, precoded program instructions and data stored in memory, a microprocessor bus for addresses, data, and control, an interrupt bus for interrupt signals, and associated hardware, operates in a conventional manner to receive digital signals, process information, and issue digital signals. A user interface in the PDA includes a visual display or audible output to present signals received from the processing system to a user, a user entry system to issue signals from the user to the processing system. The user interface may include one or more push keys, toggle switches, proximity switches, trackballs, joysticks or pressure sensitive keys, a touch-sensitive display screen, microphones or a combination of any of the above used together or with other similar type user input methods. The PDA sends digital signals representing addresses, data, and commands to the memory device and receives digital signals representing instructions and data from the memory. A PDA interface electrically connects the processing system to a GPS Smart Antenna. If the PDA and GPS are not integrated, a preferred interface comprises a computer standard low to medium speed serial data interface, such as RS-232, RS-422, or USB (1.0, 1.1, 2.0), IEEE-1394, Bluetooth (especially if the communications system operates in another band), through a cabled interface for connection to the GPS Smart Antenna.

[0799] The GPS Smart Antenna system includes a GPS receiver antenna to receive GPS satellite signals from GPS satellite transmitters, a GPS frequency downconverter to downconvert the approximately 1.575 GHz frequency of the L1 GPS satellite signals to a lower frequency (LF) signal that is suitable for digital processing, and to issue the LF to a GPS processor. The GPS processor demodulates and decodes the LF signal and provides location information for at least one of (i) location of the GPS antenna, (ii), GPS satellite pseudoranges between the GPS satellites and the GPS antenna, (iii) rate of change of location of the GPS antenna, (iv) heading of the GPS antenna, and (v) time to a GPS interface. Optionally, the GPS Smart Antenna and GPS processor are differential-ready. An optional input select switch, controlled by the GPS processor upon a request from the PDA, allows a single serial interface to receive either a control signal from the PDA or a DGPS error correction signal from an optional DGPS radio-wave receiver. Alternately, a DGPS-type system may be coordinated between multiple mobile receivers, to provide high relative position accuracy, even where the absolute position accuracy is low. Since the event position calculations are

based on the relative position frame, the effect is to accurately position the events with respect to the vehicle.

[0800] The user device may display, for example, map features according to a coordinate system such as latitude and longitude. The display may also include an indication of the location of the GPS receiver, an itinerary, proposed route, and indications of the location of various events. By correlating the GPS with a stored map, the absolute location of the vehicle may be determined by map matching techniques. In accordance with the present invention, these events are derived from the event detector or the memory. Other communications devices may also be located on the display.

[0801] The user entry system has both touchscreen keys and press keys in the present embodiment. With a touchscreen, a user enters a request by touching a designated portion overlying a visual display with his finger (or soft pointer, such as a plastic pen). The touchscreen senses the touch and causes a digital signal to be sent to the processing system indicating where the touch was made. Switches such as rotary switches, toggle switches, or other switches can equally well be applied. An advantage of the touchscreen is that a label or a placement of the touchscreen, and a corresponding function of the touchscreen, may be changed by the computer controlling the display any number of times without changing electrical or mechanical hardware. In the present embodiment, zoom keys may be employed change scale and resolution of a map on the display. Zooming in decreases the scale, so that the map is viewed with greater resolution over a lesser area of the map. Zooming out increases the scale, so that a greater area of the map is viewed with lesser resolution. A map orientation key selects an orientation of a direction on the map with a direction on the visual display, for example, orientations of north up or current ground track up. It is noted that these map functions are generally known, and known techniques may be generally applied for such map functions. According to the present invention, in addition to normal map functions, the event data may be overlayed on the map to provide additional dimensions of display data. Further, by providing these data, which are dynamic, the map system becomes useful even to travelers who are well aware of the geography and layout of the region being traveled.

[0802] One communications scheme, a 900 MHz spread spectrum communications system, operates as follows. The RF receiver includes an antenna, low noise amplifier (LNA) with a noise temperature below 80 degrees Kelvin and a helical bandpass filter to cancel the image frequency noise. The filtered signal is then downconverted to an intermediate frequency (IF) of about 70 MHz, which is the result of mixing the filtered received signal with a local oscillator signal of between about 832-858 MHz at about 17 dbm. Of course, other tuning frequencies may be selected, for example, to avoid interference with other equipment. The local oscillator thus operates at about 850 MHz and is locked to a reference of 10.625 MHz. The 70 MHz IF frequency is amplified and filtered by a SAW filter 906 with a bandwidth of 1.5-10 MHz, depending on the data signal bandwidth. The IF is then demodulated to baseband, employing a demodulator using an inverse sequence from the transmitted spread spectrum sequence. Thus, in a frequency hopping embodiment, the demodulator synthesizes a signal having the appropriate frequency sequence. In a direct sequence spread spectrum embodiment, the demodulator provides the appropriate pseudorandom code sequence to demodulate the received signal. Time synchronization may be effected by using the timing

functions of the GPS receiver. The demodulated signal is then decoded into messages, which are typically digital bit-streams.

[0803] In a 2.4 GHz system, the RF semiconductor technology will typically include gallium arsenide integrated circuits. In a 5.8 GHz system, the RF section semiconductors are preferably silicon germanium. Once demodulated to below about 1 GHz, standard silicon technologies may be employed.

[0804] The baseband demodulator may also comprise a digital radio, employing a digital signal processor, receiving a digitized IF signal and outputting a data stream. In this case, it may be preferred to digitize at an IF frequency below 70 MHz. For example, with a data stream having a bandwidth of 1.5 MHz, the preferred IF is 3-10 MHz, with quadrature digitization of the analog signal at that IF. The IF signal may be processed in parallel with a plurality of demodulators, allowing multiple signals to be received simultaneously.

[0805] In the 900 MHz embodiment, a PLL, such as a 1.1 gigahertz PLL frequency synthesizer, Part No. MC145190 available from Motorola Semiconductors, Phoenix, Ariz., may be used to generate the first IF. This frequency synthesizer, referenced to the 9.6 megahertz reference frequency, generates a local oscillator signal of approximately 860 megahertz. This PLL synthesizer chip produces a locked stable output signal which is low pass filtered to produce a variable voltage to control voltage control oscillator. VCO is, for example, Part No. MQC505-900 operating at approximately 860 megahertz and available from Murata of Tokyo, Japan. The feedback through sense keeps synthesizer chip stable to produce a stable, fixed course output. A second PLL produces a fine control frequency. The second PLL includes a synthesizer chip, e.g., Part No. MC145170 available from Motorola Semiconductor of Phoenix, Ariz. This PLL frequency synthesizer chip has digital controls for control by a microcontroller. The output of the fine synthesizer chip is low pass filtered to produce a variable DC voltage to control a voltage controlled oscillator, e.g., Part No. MQC309-964, operating within the 900 megahertz band. The fine adjust frequency is band pass filtered with an SAW band pass filter with a center frequency of approximately 38 megahertz. The band pass filter is, for example, Part No. SAF38.9MZR80Z also available from Murata of Tokyo, Japan. The output of the second PLL is controlled in accordance with the output frequency desired based on the frequency of the hop transmitted at the current time. By adjusting the fine frequency, which would be mixed with the coarse frequency, the output frequency in the 900 megahertz band is produced with very little phase noise, very little phase jitter and extremely narrow noise skirt. Thus, this double loop system serves to demodulate the signal to a low IF frequency or to baseband.

EXAMPLE 2

[0806] Ad hoc networks are a good candidate for analysis and optimization according to game theory. A multihop ad hoc network requires a communication to be passed through a disinterested node. The disinterested node incurs a cost, thus leading to a disincentive to cooperate. Meanwhile, bystander nodes must defer their own communications. By understanding the decision analysis of the various nodes in a network, it is possible to define a system which, in accordance with game theory, provides a benefit or incentive to promote cooperation and network reliability and stability. The incentive, in economic form, may be charged to the node(s) benefiting from

the communication, and is preferably based on a value of the benefit received. This network optimization employs a modified combinatorial (VCG) auction, which optimally compensates those burdened by the communication, while charging the benefiting participants. Equilibrium usage and headroom may be influenced by deviating from a zero-sum condition. The mechanism seeks to define fairness in terms of market value, providing probable participation benefit for all nodes, leading to network stability.

I. Introduction

[0807] I describe the application of game theory concepts to the arbitration of access to bandwidth in an ad hoc communications network, more particularly to network including mobile nodes. According to applicable elements of game theory, an agent makes a decision to cooperate with a system having established rules, or to circumvent it. Likewise, cheating, i.e., adopting behavior contrary to an expected nor, may be an option, and can be analyzed in the context of a decision. Therefore, a game theoretic approach addresses the situation where the operation of an agent which has freedom of choice, allowing optimization on a high level, considering the possibility of alternatives to a well designed system. According to game theory, the best way to ensure that a system retains compliant agents, is to provide the greatest anticipated benefit, at the least anticipated cost, compared to the alternates.

[0808] Mobile ad hoc networks encompass multihop networks, which, by their nature, require participation of disinterested nodes to operate. Technically, however, the multihop scenario is not intrinsic, since it is reasonable to presume that in some networks, all nodes are within range of each other. Each scenario poses a classic game theory issue to each node: why defer to other nodes if no direct benefit is obtained? The multihop network adds the further issue of: why participate in communications between other nodes if no direct benefit is obtained? We discuss a set of mechanisms, incentives and rationales as a framework for analyzing node behavior and optimization, and seeks to respond to these issues by proposing appropriate incentives to promote network efficiency and stability.

[0809] In these sections, we seek to avoid mathematical expression of the principles, as well as formal proofs. This is for three reasons: these mathematical expressions and proofs are detailed elsewhere, the recitation of these formulae and associated derivation are distracting to the essence presented herein, and such a presentation might imply that, in practice, complete information may be available in order to fully evaluate and employ such expressions. In fact, it is likely that any real and feasible implementation of will sufficiently deviate from a tractable theoretical model, and thus require substantial simplifying presumptions, to make any such presentation misleading.

II. Background

[0810] The application of game theory to ad hoc networks has been addressed in various forms to date. In general, there is a divergence between approaches which define a real-world system, with all of its complexity, and required functionality, and those which seek to mathematically tractable model having a definite set of rules and presumptions leading to a comprehensible and useful result. Each level of complexity and relaxation of limitations on the system, decreases the ability to accurately model the system and produce a result

directly applicable to a deployable control system. Construction and evaluation of models lags their theoretical exposition. Focus is on a theoretical framework for the arbitration control system, with the modeling and evaluation remaining as the subject of later work.

[0811] An ad hoc network is a wireless network which does not require fixed infrastructure or centralized control. The terminals in the network cooperate and communicate with each other, in a self organizing network. In a multihop network, communications can extend beyond the scope of a single node, employing neighboring nodes within the scope, to forward messages. In a mobile ad hoc network, constraints are not placed on the mobility of nodes, that is, they can relocate within a time scale which is short with respect to the communications, thus requiring consideration of dynamic changes in network architecture.

[0812] Ad hoc networks pose control issues with respect to contention, routing and information conveyance. There are typically tradeoffs involving equipment size, cost and complexity, protocol complexity, throughput efficiency, energy consumption, and “fairness” of access arbitration. Other factors may also come into play.

[0813] Game theory studies the interactions of multiple independent decision makers, each seeking to fulfill their own objectives. Game theory encompasses, for example, auction theory and strategic decision-making. By providing appropriate incentives, a group of independent actors may be persuaded, according to self-interest, to act toward the benefit of the group. That is, the selfish individual interests are aligned with the community interests. In this way, the community will be both efficient and the network of actors stable and predictable. Of course, any system wherein the “incentives” impose too high a cost, themselves encourage circumvention. In this case, game theory also addresses this issue.

[0814] We first analyze the issues that give rise to cooperative problems in ad hoc networks. We then survey game theory in its traditional forms, followed by a more complete discussion of ad hoc networks. We then focus on published examples of the application of game theory to the control and analysis of ad hoc networks, more particularly on the theoretical costs and benefits applicable to nodes in ad hoc networks, the behavior of communications nodes, and apply game theory to define incentives predicted to result in an efficient ad hoc network. Finally, we provide a new framework for a real-time telematics information communication network proposed for deployment.

III. Cooperative Problems in Ad Hoc Networks

[0815] To understand why game theory is applicable the control over ad hoc networks, consider the analogy of a classroom. The teacher acts as a central authority and arbitrator to ensure decorum. The teacher recognizes one student at a time for public communication. This is an example of centralized control. If there were no teacher to recognize a student, pandemonium would result, unless a suitable process of self-organization is established, which obtains cooperation dictating common rules, adopted according to mutual incentives.

[0816] Now, suppose one student wishes to send a note across the room. Presumably, there are multiple paths to the destination. But how can the student be sure that the note will be forwarded? How does one know which neighbor to hand-off to? Suppose that forwarding the note imposes a burden, such as the risk of being caught and sanctioned? Consider the

possibility, after conclusion of negotiations for forwarding, a student fails to fulfill his assumed responsibility?

[0817] It is therefore clear that the issues of subjective and objective costs and benefits, distance, complexity, and reliability, are therefore interrelated, and there may be practical restraints on achieving theoretical system capacity.

[0818] The game theoretic solution is to link an incentive or benefit to the desired behavior, to promote each agent cooperate with note forwarding, on a rational basis. The ultimate payoff should be borne by the student receiving the benefit. Thus, by linking a benefits to costs, a stable society is achieved, approaching a desirable equilibrium.

[0819] In order to incentivize the intermediaries, a student could compensate them by taping dimes to the note, instructing each forwarding student to remove one dime (the packet purse model). Alternately, the recipient may be expected to pay for the transmission through an acknowledgement message with attached value (the packet trade model). However, how do we know that the first recipient will not remove all the money and throw away the note? How can the intermediaries ensure, in the packet trade model, that the recipient will eventually pay? How does the responsible party know how much must be paid? These models also require stability of the route during the process, and imply a priori knowledge of the route. This approach does not permit variations in compensation, e.g., some students might accept a nickel, and others in a critical position, might require a quarter. In cases of unreliable routes, should the originator send two notes by alternate paths, or attempt to pay more for a single reliable delivery?

[0820] Even with imposition of a traffic sensitive cost, one node of the network may seek to send an inordinate number of messages, resulting in congestion. A node in a critical location may become wealthy, and its fees rise, leading to instability. Likewise, in a virtual construct, what does one use as currency? We see that consideration must be given to keeping traffic below capacity, since highly loaded networks often have decreased efficiency.

IV. Game Theory

[0821] Game theory is the study of the interaction of independent agents, in an environment where there are rules, decisions, and outcomes. Game theory defines the theoretical basis for strategy, as well as providing a framework for analyzing real-world actors. Game theory may be applied to automated systems, providing a basis for the analysis and optimization of such systems. Aspects of game theory have been applied to telecommunications, for example to optimize network routing, and has quality of service implications. Communications resources may be treated as utilities, and auctions have been applied to the optimization of allocation of utility resources.

[0822] Each game has a set of rules or constraints, under which the agents operate. “Cheating”, if permitted at all, is modeled as an available decision of an agent to comply with other constraints. Therefore, the game is valid as a model only for the rules and constraints considered. Each decision maker pursues a goal, and may take into account their knowledge or expectations of the other decision makers’ behavior. According to game theory, rationality leads to optimality, and therefore analyzing the game and acting logically in accordance with the rules leads to the best outcome.

[0823] It is conceptually simple for an automated system to act rationally. That is, given a set of facts and circumstances, the rational analysis is fixed and obtainable. On the other

hand, humans acting on purely mental consideration may deviate from rationality. For example, humans exhibit a broad range of risk tolerance, which is not directly explained by rational analysis. It is noted that risk tolerance, and other aspects of behavior, have been modeled, and as such, can themselves be treated scientifically and rationally. In fact, game theory expressly recognizes that agents may express private values which are not rationally explained, and that by understanding these values, a strategic advantage is obtained. Thus, while rationality is assumed as an optimum strategy for each entity, real entities have imperfect estimates of payoff and risk, and indeed may miscalculate or misconstrue the circumstances. Such perturbations may be compensated, under certain circumstances, by way of various parameters added to the modeling equation.

[0824] Game theory is typically encompassed in the study of economics, since a self-interested node will always try to increase its wealth, and all other concepts may be considered in terms of their subjective economic costs and benefits. Game theory can be used not only to analyze a defined game, but also to define a game having a desired outcome, i.e., to optimize a set of rules and constraints. The preferences of a node can be expressed either with a utility function, or with preference relations, ranking various consequences.

[0825] Games can be divided into noncooperative and cooperative games. In cooperative games, the joint actions of groups are analyzed, i.e. what is the outcome if a group of players cooperate. In noncooperative games, the actions of the single players are considered. The cooperative game model may be used to analyze heterogeneous ad hoc networks. In strategic games, decisions are made at the commencement of the game. In extensive games, decisions may be made interactively. The strategic game model is suitable for representing simple real life events such as a sealed bid auction. A progressive bid auction may be modeled as an extensive game.

[0826] Games can also be divided according to their payoff structures. A game is called zero-sum game if the sum of the utilities is constant in every outcome. Zero-sum games are considered strictly competitive games. For example, an auction is a zero sum game, since the buyer pays the seller, with no other gains or losses incurred. If the players are fully informed about each other's moves, the game has perfect information. Only extensive games consider the issue of perfect information. In games with complete information the utility function of each player is known. In a game with incomplete information, the privacy of a player's utility function is held as a strategic advantage.

[0827] Pareto efficiency exists if there is no other outcome that would make all players better off. An equilibrium is a result of the optimization of the individual players; but does not imply that the result is "good" or globally optimum. The solution of a strategic game is a Nash equilibrium. Every strategic game with finite number of players, each with a finite set of actions, has an equilibrium point. This Nash equilibrium is a point from which no single player wants to deviate unilaterally. When a game is played, the rationality assumption will force the game into a Nash equilibrium outcome. If the outcome is not a Nash equilibrium, at least one player would gain a higher payoff by choosing another action. If there are multiple equilibriums, more information on the behavior of the players is needed to determine the outcome of the game.

[0828] In the strategic and extensive games, the solution of a game is a complete set of strategies that achieve a Nash equilibrium. In cooperative games, the solution comprises the subsets of players or coalitions from which no member has an incentive to break away. Cooperative games can be divided between games in which the coalition is free to internally distribute a payoff (transferable payoff), and those in which the payoff is personal to coalition members (non-transferable payoff). A dominant strategy is one in which the same decision is made based on the various different rational strategies an agent may adopt.

[0829] To better understand game theory, it is useful to consider simple games. In one game, called the prisoner's dilemma, two criminals are arrested and charged with a crime. The police do not have enough evidence to convict the suspects, unless at least one confesses. They are not able to communicate. If neither confesses, they will be convicted of a minor crime and sentenced for one month. If one confesses, and the other does not, the confessing one will be given immunity and released and the other will be sentenced for nine months. If both confess, both will be sentenced for six months.

[0830] Another famous game is the battle of the sexes. A couple is going to spend an evening out. She wishes to attend the opera and he wishes to attend a hockey match, but each gains a benefit of the other's company.

[0831] In the prisoner's dilemma, all the outcomes except (Confess; Confess) are Pareto efficient. In the battle of the sexes, an outcome in which husband and wife attend different events are not Pareto efficient. The outcome (Confess; Confess) is the equilibrium, while outcome (Don't confess; Don't confess) results in higher payoff for both the criminals, but it is not an equilibrium because both the players have an incentive to deviate from it. In the battle of the sexes, the pure strategy equilibrium points are (Opera; Opera) and (Hockey; Hockey). There is also a third Nash equilibrium with mixed strategies, in which both choose their preferred option with probability 2:3. The prisoner's dilemma is a good example of a sub-optimal equilibrium. Both players would gain a higher payoff by playing (Don't confess; Don't confess).

[0832] Another example of game theory is the so-called tragedy of the commons. In this game, a set of farmers live in a community with a grass-filled square. Each farmer is confronted with a decision as to whether to acquire another goat, which eats grass in the square. So long as the benefit of having the goat is in excess of the personal detriment of that goat's grass consumption, it is a dominant strategy to acquire the goat, even though the necessary result of all farmers acting rationally is the loss, to all, of the benefits of the square.

[0833] In computer networks, issues arise as the demand for communications bandwidth approaches the theoretical limit. Under such circumstances, the behavior of nodes will affect how close to the theoretical limit the system comes, and also which communications are permitted. The well known collision sense, multiple access (CSMA) protocol allows each node to request access to the network, essentially without cost or penalty, and regardless of the importance of the communication. While the protocol incurs relatively low overhead and may provide fully decentralized control, under congested network conditions, the system may exhibit instability, that is, a decline in throughput as demand increases, resulting in ever increasing demand on the system resources and decreasing throughput. According to game theory, the deficit of the CSMA protocol is that it is a dominant strategy

to be selfish and hog resources, regardless of the cost to society, resulting in “the tragedy of the commons.”

[0834] Game theory is most readily applied in the optimization of communications routes through a defined network, to achieve the best surplus allocation. The problems of determining the network topology, and conducting the communications themselves, are also applications of game theory. Since the communications incidental to the network access arbitration require consideration of some of the same issues as the underlying communications, elements of game theory apply correspondingly. Due to various uncertainties, the operation of the system is stochastic. This presumption, in turn, allows estimation of optimality within an acceptable margin of error, permitting simplifying assumptions and facilitating implementation.

[0835] In an ad hoc network used for conveying real-time information, as might be the case in a telematics system, there are potentially unlimited data communication requirements, and network congestion is almost guaranteed. Therefore, using a CSMA protocol as the paradigm for basic information conveyance is destined for failure, unless there is a disincentive to network use. On the other hand, a system which provides more graceful degradation under high load, sensitivity to the importance of information to be communicated, and efficient utilization of the communications medium would appear more optimal. Such a system is proposed below in Section VII.

[0836] One way to impose a cost which varies in dependence on the societal value of the good or service, is to conduct an auction, which is a mechanism to determine the market value of the good or service, at least between the auction participants. In an auction, the bidder seeks to bid the lowest value, up to a value less than or equal to his own private value (the actual value which the bidder appraises the good or service, and above which there is no surplus), that will win the auction. Since competitive bidders can minimize the gains of another bidder by exploiting knowledge of the private value attached to the good or service by the bidder, it is generally a dominant strategy for the bidder to attempt to keep its private value a secret, at least until the auction is concluded, thus yielding strategies that result in the largest potential gain. Auction strategies become more complex when the bidder himself is not a consumer or collector, but rather a reseller. In this case, the private value of the bidder is influenced by the perception of the private value of other bidders, and thus may change over the course of the auction in a successive price auction. On the other hand, in certain situations, release or publication of the private value is a dominant strategy, and can result in substantial efficiency, that is, honesty in reporting the private value results in the maximum likelihood of prospective gain.

[0837] A so-called Vickrey-Clarke-Groves, or VCG, auction, is a type of auction suitable for bidding, in a single auction, for the goods or services of a plurality of offerors, as a unit. In the classic case, each bidder bids a value vector for each available combination of goods or services. The various components and associated ask price are evaluated combinatorially to achieve the minimum sum to meet the requirement. The winning bid set is that which produces the maximum value of the accepted bids, although the second (Vickrey) price is paid. In the present context, each offeror submits an ask price (reserve) or evaluable value function for a component of the combination. If the minimum aggregate to meet the bid requirement is not met, the auction fails. If the auction

is successful, then the set of offerors selected is that with the lowest aggregate bid, and they are compensated that amount.

[0838] The surplus, i.e., gap between bid and ask, is then available to compensate the deferred bidders. This surplus is distributed proportionately to original the bid value for the bidder, thus further encouraging an honest valuation of control over the resource.

[0839] The network is such that, if any offeror asks an amount that is too high, it will be bypassed. Since the bidder pays the second highest price, honesty in bidding the full private value is encouraged, with the further incentive of the losing bidder payment being proportional to the bid. VCG auctions have found application in providing segment links to route goods, or information in a network. In defining the goods and services that are the subject of the auction, it is possible to value the non-interference of a competitor; that is, a competitor is both a buyer and seller in the sale multi-good auction, with the purchase and sale being inconsistent combinations.

[0840] The traditional VCG auction, is postulated as being optimal for allocation of multiple resources between agents. It is “strategyproof” and efficient, meaning that it is a dominant strategy for agents to report their true valuation for a resource, and the result of the optimization is a network which maximizes the value of the system to the agents. Game theory also allows an allocation of cost between various recipients of a broadcast or multicast. That is, the communication is of value to a plurality of nodes, and a large set of recipient nodes may efficiently receive the same information. This allocation from multiple bidders to multiple sellers is a direct extension of VCG theory, and a similar algorithm may be used to optimize allocation of costs and benefit.

V. Ad Hoc Networks

[0841] In an ad hoc network, there is no central authority controlling network operation, and there is typically a presumption that some nodes cannot directly communicate with others, leading to a requirement for communication intermediaries to forward packets, i.e., a multihop architecture. A mobile ad hoc network adds the further presumption that nodes are not stationary, and therefore a route discovery mechanism is required.

[0842] In order to determine the network architecture state, each node must broadcast its existence, and, for example, a payload of information including its identity, location, itinerary (navigation vector) and possibly an “information value function” and/or “information availability function”. Typically, the system operates in a continuous state, so that, after stabilization, it is reasonable to estimate of the present state based on the prior state information. In a system with mobile nodes, the mobility may be predicted, or updates provided as necessary. Using an in-band or out-of-band propagation mechanism, this information must propagate through a sphere of influence or to a network edge, which may be physically or artificially defined. Nodes may be presumed to operate with a substantially common estimation of network topology, and therefore only deviations from previously propagated information need be propagated. Of course, a mechanism should be provided for initialization and in case a new node joins the network. If such estimates were accurate, the network could then be modeled similarly to a non-mobile network, with certain extensions. On the other hand, typical implementations will present substantial deviations between actual network architecture and predicted network architec-

ture, requiring substantial fault tolerance in the fundamental operation of the protocol and system.

[0843] If we presume that there is a spatial or temporal limit to relevance, for example, 5 miles or 10 hops, or 1 to 5 minutes, then the network state propagation may be so limited. Extending the network to encompass a large number of nodes, will necessarily reduce the tractability of the optimization, although this may also produce substantial benefits, especially if the hop distance is relatively short with respect to the desired communication range. Each node may therefore impose a local estimate of relevance as a filter on communications, especially arbitration communications. This consideration is accommodated by communicating, from each node, an update to all other nodes within its network relevance boundary, and a state variable which represents an estimate of relevant status beyond the arbitrarily defined boundary. The boundary estimate is advantageous in order to ensure long range consistency. On a practical note, assuming a cost is incurred by employing the ad hoc network, which scales with the number of hops, then at some point, especially considering the latency and reliability issues of ad hoc networks with a large number of hops, it is more efficient to employ cellular communications or the like. On the other hand, making the ad hoc network suitable and reliable for 100 hop communications will necessarily impede communications over a much smaller number of hops, thus disincentivizing the more reasonable uses of the network.

[0844] For example, the propagation of network state and other protocol-level information may conveniently occur over a finite number of hops, for example 5-10, in an outward direction, a condition which may be assessed by GPS assistance. For each hop, a relatively simple protocol, such as a collision sense-multiple access (CSMA) protocol, may be employed, with each node propagating information according to a set of rules. (It is noted that, since this communication is not "limitless" in contrast to bulk real-time sensor data, CSMA may be an appropriate and efficient protocol).

[0845] An example of the application of game theory to influence system architecture arises when communications latency is an issue. A significant factor in latency is the node hop count. Therefore, a system may seek to reduce node hop count by using an algorithm other than a nearest neighbor algorithm, bypassing some nodes with longer distance communications. In analyzing this possibility, one must not only look at the cost to the nodes involved in the communication, but also the cost to nodes which are prevented from simultaneously accessing the network. As a general proposition, the analysis of the network must include the impact of each action, or network state, on every node in the system, although simplifying presumptions may be appropriate where information is unavailable, or the anticipated impact is trivial.

[0846] There are a number of known and proven routing models proposed for forwarding of packets in ad hoc networks. These include Ad Hoc On-Demand Distance Vector (AODV) Routing, Optimized Link State Routing Protocol (OLSR), Dynamic Source Routing Protocol (DSR), and Topology Dissemination Based on Reverse-Path Forwarding (TBRPF). In most systems analyzed to date, the performance metrics studied were power consumption, end-to-end data throughput and delay, route acquisition time, percentage out-of-order delivery, and efficiency. A critical variable considered in many prior studies is power cost, presuming a battery operated transceiver with finite available power. There can be

significant differences in optimum routing depending on whether node has a transmit power control, which in turn controls range, and provides a further control over network topology. Likewise, steerable antennas, antenna arrays, and other forms of multiplexing provide further degrees of control over network topology. Note that the protocol-level communications are preferably broadcasts, while information conveyance communications are typically point-to-point. Prior studies typically presume a single transceiver, with a single antenna, and thus use an omni-directional antenna, with in-band protocol data, for all communications. The tradeoff made in limiting system designs according to these presumptions should be clear.

[0847] Routing protocols in ad hoc networks typically employ three strategies: flooding, proactive routing, and reactive routing. Flooding protocols broadcast packets to all the nodes in the network, while the remaining protocols do not. In proactive routing, the protocol maintains route information all the time, while in reactive routing, a route is discovered only when needed. All or some of these strategies may be employed simultaneously. Flooding typically consumes too much bandwidth and energy to be efficient, as compared to more sophisticated strategies. However, in cases with very high mobility, the flooding protocols best ensure that the transmission reaches its destination.

[0848] In proactive routing, each node stores and updates routing information constantly. The routing tables can be updated based on perceived changes in the network topology. Therefore, a new transmission can start immediately without a route discovery delay. However, the constant exchange of routing information adds overhead to the protocol. OLSR and TBRPF protocols use proactive routing. The overhead traffic of a proactive routing protocol increases as the mobility of the nodes increases, since the routing information needs to be updated in shorter intervals.

[0849] In reactive routing, when a node wishes to transmit, it starts a route discovery process in order to find a path to the receiver. The routes remain valid until the route is no longer needed. AODV and DSR protocols use reactive routing. In the AODV protocol, to find a route to a receiver, a terminal broadcasts a route request message containing the address of the receiver and the lifespan of the message. Terminals receiving the message add their address to the packet and forward it if the lifespan is not exhausted. If a receiver or a terminal knowing the route to the receiver receives the route request message, it sends a route reply back to the requester. If the sender does not receive a route reply before a timeout occurs, it sends another route request with a longer lifespan. The use of sequential route requests with incremental increases in timeout allows a mapping of the network by hop count.

[0850] In order for an ad hoc network to be effective, the nodes need to cooperate. This cooperation comes at a cost. In power constrained systems, for example, the cost is battery consumption. In other scenarios, the network utilization is itself a burden. The various nodes must cooperate in both arbitration and control, e.g., route discovery and optimization, and the information forwarding itself. In fact, participation in the route discovery, without notice that the node will fail to forward information packets, has been shown in studies to be more detrimental to the network than simply abstaining entirely.

[0851] It is the general self-interest of a node to conserve its own resources, maintain an opportunity to access resources, while consuming whatever resource of other nodes as it

desires. Clearly, this represents the “tragedy of the commons”, in which selfish individuals fail to respect the very basis for the community they enjoy, and a network of rational nodes operating without significant incentives to cooperate would likely fail. On the other hand, if donating a node’s resources generated an associated benefit to that node, while consuming network resources imposed a cost, stability and reliability can be achieved. So long as the functionality is sufficient to meet the need, and the economic surplus is “fairly” allocated, that is, the cost incurred is less than the private value of the benefit, and that cost is transferred as compensation to those burdened in an amount in excess of their incremental cost, adoption of the system should increase stability. In fact, even outside of these bounds, the system may be more stable than one which does not tax system use nor reward altruistic behavior. While the system is a zero sum system, and over time, the economic effects will average out, in any particular instance, the incentive for selfish behavior by a node will be diminished.

[0852] The concepts of node misbehavior and maliciousness, and competing networks consuming the same resources, are not addressed at length herein. However, these issues are also addressed by aspects of game theory. For example, an ad hoc network may defer to or compete with an interfering network, and the decision of which strategy to adopt is within the province of game theory. The particularities of agent misbehavior or hacking are not completely addressed herein, although real implementations must necessarily consider these issues. Sometimes, the solution to these issues is technological, but in others, the reaction of other nodes to discovery of misbehavior may be sufficient to discourage it. The intent is to formulate a system which is sufficiently robust and advantageous as to disincentivize non-compliance and non-cooperation, that is, the inherent advantages of compliance with the system architecture exceed the anticipated benefits of the alternative.

[0853] One way to remedy selfish behavior is to increase the cost of acting this way, that is, to impose a cost or tax for access to the network. In a practical implementation, however, this is problematic, since under lightly loaded conditions, the “value” of the communications may not justify a fixed cost which might be reasonable under other conditions, and likewise, under heavier loads, critical communications may still be delayed or impeded. Note that where the network includes more nodes, the throughput may increase, since there are more potential routes and overall reliability may be increased, but the increased number of nodes will likely also increase network demand. A variable cost, dependent on relative “importance”, may be provided, and indeed, as alluded to above, this cost may be market based, in the manner of an auction. In a multihop network, such an auction is complicated by the requirement for a distribution of payments between the chain of nodes, with each node having potential alternate demands for its cooperation. The VCG auction mechanism excludes nodes which ask too high a price, and the auction itself may comprise a value function encompassing reliability, latency, quality of service, or other non-economic parameters, in economic terms. The network may further require compensation to nodes which must defer communications because of inconsistent states, such as in order to avoid interference or duplicative use of an intermediary node, and which take no direct part in the communication. It is noted that the concept of the winner of an auction paying the losers is relatively obscure, and itself upsets the

normal analysis, since the possibility of a payment from the winner to the loser alters the allocation of economic surplus between the bidder, seller, and others. Likewise, while the cost to the involved nodes may be real, the cost to the uninvolved nodes may be subjective. Clearly, it would appear that involved nodes should generally be better compensated than uninvolved nodes, although a formal analysis remains to be performed.

[0854] In a more general sense, the underlying presumption is that the network provides competitive access to the physical transport medium, and that cooperation with the protocol provides significant advantages over competition with it. Clearly, the issues of commercial success and market dominance are much more complex and not capable of being accurately modeled according to known paradigms; on the other hand, a system providing rational benefits will be more likely to succeed than one with irrational benefits or ill defined explicable benefits. Under normal circumstances, a well developed ad hoc network system can present as a formidable coordinated competitor for access to contested bandwidth by other systems, while within the network, high valued communications may receive priority. Thus, a node presented with a communications requirement is presented not with the simple choice of participate or abstain, but rather whether to participate in an ad hoc network with predicted stability and mutual benefit, or one with the possibility of failure due to selfish behavior, and non-cooperation. Even in the absence of a present communication requirement, a network which rewards cooperative behavior may be preferable to one which simply expects altruism.

[0855] After the network architecture is defined, compensation is paid to those nodes providing value or subjected to a burden (including foregoing communication opportunity) by those gaining a benefit. The payment may be a virtual currency, with no specific true value, although the virtual currency system provides a convenient method to tax, subsidize, or control the system, and thus apply a normalized extrinsic value.

[0856] Game theory also encompasses the concept of that each node may have an associated “reputation” in the community. This reputation may be evaluated as a parameter in an economic analysis, or applied separately. This reputation may be anecdotal or statistical. In either case, if access to resources and payments are made dependent on reputation, nodes will be incentivized to maintain a good reputation, and avoid generating a bad reputation. Therefore, by maintaining and applying the reputation in a manner consistent with the community goals, the nodes are compelled to advance those goals in order to benefit from the community. Game theory distinguishes between good reputation and bad reputation. Nodes may have a selfish motivation to assert that another node has a bad reputation, while it would have little selfish motivation, absent collusion, for undeservedly asserting a good reputation. On the other hand, a node may have a selfish motivation in failing to reward behavior with a good reputation.

[0857] The virtual currency and reputation may be considered orthogonal, since the status of a node’s currency account provides no information about the status of its reputation.

VI. Published Ad Hoc Network Examples

[0858] By no way a comprehensive list of published applications of game theory to the control of ad hoc networks, below are discussed a number of prominent examples.

[0859] The Terminodes project includes many of the features described above. This project proposes a method to encourage cooperation in ad hoc networks that is based on a virtual currency called nuglets. Each node contains a tamper-proof hardware module which handles the nuglets. When a node forwards a packet it extracts nuglets from the payload. In order to make a transmission, the sender appends nuglets needed to forward the packet through the network to its destination. However, a central node probably likely accumulates excess nuglets, hence it has less value for additional nuglets, leading to lower incentive for network activity. Peripheral nodes may possess insufficient nuglets to support their needs. However, the system appears to achieve a balance over time, assuming random node movement. The Terminodes project is notable for the depth and completeness of its analysis, as well as the progress made toward implementation.

[0860] Crowcroft et al. present a traffic-sensitive pricing model. Compensation for packet forwarding is responsive to both required energy consumption and local congestion at a node. This mechanism both enforces cooperation and balances traffic loads to avoid congestion. Stabilization of price and node wealth occurs in static networks.

[0861] The Confidant protocol detects node misbehavior and routes traffic around the misbehaving nodes, to isolate them from the network. Misbehavior of neighboring nodes is broadcast to the network by observing nodes. A trust record is used to evaluate the validity of a report, thus disincentivizing misbehavior in the reporting process. The reputation information is applied by a path manager define a route and rejects access requested by misbehaving nodes.

[0862] The Core protocol is similar to Confidant; each node maintains reputation information, which is updated based on both observation and third party report. A threshold function is applied to limit access by nodes based on their reputation, resulting in isolation.

[0863] Michiardi et al. analyze whether it is optimal to join or defect from an ad hoc network, based on node utility function, payoff share, cost of cooperation, number of cooperating nodes, etc.

[0864] Srinivasan et al. apply game theory to model an ad hoc network at a connection level, providing a complicated extended game model. Before a user can transmit, all the nodes along the defined route must accept the relay request. Energy consumption of terminals is restricted by an expected lifetime of batteries, that is, the nodes are modeled as being power constrained. A normalized acceptance rate, a proportion of successful and attempted relays through a node, as observed by neighboring nodes, is sought to be maximized.

[0865] Urpi et al. model an ad hoc network at packet level. The model is based on an estimate of neighboring nodes, the remaining energy of node, and various packet traffic metrics. The payoff of the model is simply the access to packet forwarding, weighted by energy cost, provided to a node.

[0866] Noncooperative game theory offers a basis for analyzing Internet traffic, wherein each user tries to independently maximize its quality of service. The network operator focuses on maximizing network performance as a whole. Thus, in this case, different players adopt different roles, with different value functions. Game theory may thus be applied to optimize routing, flow control, queuing disciplines and traffic pricing. While ad hoc network routing is similar to the Internet, there are also significant differences. In an ad hoc network, routes may be inconsistent.

[0867] Nagle studied the concept of fairness in queuing in packet switches. In a first in-first out queue, a selfish node may saturate the queue with requests. Nagle proposes, as a solution, distinct queues for each source with a round-robin scheduler, providing a fair queuing scheme, which encourages keeping the user's queue as short as possible.

[0868] Game theory has also been applied on flow control. Each user tries to maximize its utility, defined by the ratio of average throughput and average delay. It has been shown that a unique Nash equilibrium exists in such a system, which converges to an equilibrium point. The nodes seek to both maximize their own quality of service, but also the fairness of resource allocation, resulting in a Pareto efficient solution.

[0869] ALOHA is a wireless CSMA protocol using time division multiplexing. Transmission probabilities are a design specification of the system, but if a player uses a higher probability, his throughput will likely increase, leading to a misbehavior incentive. The selfish system appears to perform no better than a centrally controlled (non-CSMA) system, and performance typically drops by half. A pricing mechanism may be incorporated, thus taxing users for their bandwidth demands. An extensive analysis of the subject of the application of game theory to the control of ad hoc networks, including both an extensive review of the literature, and new analysis, is provided in the master's Thesis of Juha Leino, entitled "Applications of Game Theory in Ad Hoc Network", Helsinki University Of Technology (2003). Leino modeled the interaction between one node and the rest of the network as an extensive game. The networks were presumed to be energy constrained, and the nodes to be selfish, with the result stated as the amount of contribution the network can request from a node. Leino modeled nodes with power constrained, power adaptive, omnidirectional transceivers, each of which have a uniform communication demand on the network.

[0870] When a node connects to an ad hoc network, it gains both benefits and obligations. The other nodes forward its traffic, hence it can save energy and reach nodes outside its own transmission range, as compared to a single hop transmission. Correspondingly, the node should participate in the network functions like the route discovery and traffic forwarding that consume the resources of the node, in addition to the basic communications themselves. In order to find participation in the network advantageous, the node has gain greater benefits greater than the obligations imposed. This, of course, may be modeled as a game. The node seeks to minimize energy consumption, and the network seeks to ensure its functionality. The decision of the node is to cooperate or to defect.

[0871] In one of Leino's models, he requires that reward of forwarding needs to be proportional to the energy consumed when the packet is forwarded. He analyzes the situation of both a honest node and a cheating node, i.e., one that uses the network's resources without full participation in the network overhead. He concluded that if a node has an opportunity to cheat, it adversely affects the network far more than mere defection. Leino also analyzed whether, under his presumptions, a group of honest nodes will voluntarily aggregate as an ad hoc network, or would prefer to remain as a set of independent uncooperative actors, without benefit of multihop transmissions. He concludes that under his presumptions, in some networks, there are nodes which have detrimental involvement in the ad hoc network, and if all such "loser" nodes refuse to participate, the network may collapse. The proportion of losers drops with minimum energy routing,

since the average cost is lowered, making gains from participation more likely. There are also networks with no losers, and these provide gains to all participants. Loser nodes tend to be in the center of the network, rather than the periphery.

VII. Real Time Telematics Information Communication

[0872] Mobile, self organizing, ad hoc communications networks have been proposed for telematics systems, for cellular network extension, long range (multihop) traffic information communication, and short range collision avoidance systems.

[0873] Telematics is a recently applied term that now encompasses radio transmitters or receivers in vehicles. Three basic schemes exist: wide area broadcast communication, where all relevant nodes are presumed to be within the same communication zone (e.g., satellite radio, RDDS receivers, etc.); cellular communications, where an array of fixed-position low power transceivers contiguously blanket a territory, providing various zones which allow multiplexing within a band; and mesh network communications, which allow ad hoc formation of a communications infrastructure, optionally linking to various fixed infrastructure.

[0874] Telematics systems may be used for many purposes, for example, real time traffic information (RTTI), which in an extreme case may involve communication of live video streams. In a more modest system, various sensors may provide road and traffic data, as well as weather and incident information. In other words, the appetite of such a system for bandwidth is potentially limitless, unless constraints are imposed. On the other hand, RTTI is typically not power constrained, since it is vehicle based rather than hand-held, and therefore the cost of using the system will focus more on competition for bandwidth (the limited physical transport layer (PHY) resource) than power consumed in communications. Likewise, communications latency is not critical, unless full duplex voice communications are supported. It is noted that parked vehicles may also be involved in network communications, and the frequency band may be shared with portable communicators with self-contained power sources, making the economic cost of communications and power consumption a potential factor for some nodes, leading to split strategies.

[0875] Likewise, especially for voice communications, interfacing with the fixed infrastructure through cellular telephone towers or 802.11 hotspots may impose additional economic constraints on the system. Telematics systems typically include a GPS geolocation system, which may be of great use in mapping nodes for routing navigation functions. Indeed, the telematics system may be integrated within a navigation system and/or entertainment system. This is relevant to the extent that one considers the incremental cost of the hardware and its market placement.

[0876] The system is designed to operate over a wide range of node densities, from city rush hour traffic to rural highways. Due to a perceived incompatibility of a RTTI system with cellular infrastructure business models, as well as inconsistent availability of cellular coverage of roadways, the architecture is designed as a decentralized control, with incidental involvement of the cellular networks, except for voice communications outside of the mobile ad hoc network. This decentralized control introduces a substantial level of complexity, since it must account for rapidly changing network

architecture, various types of channel impairments, hidden nodes, and temporal and spatial distance issues, and interference.

[0877] In defining the system, both the available hardware, costs and purposes for use must be considered. Desirable characteristics of a telematics system include real time telematics information communication, multihop voice communication forwarding, decentralized control, and to the extent possible, user privacy. The hardware may include multichannel directional smart antennas, out-of-band signaling and control, complex and sophisticated computational resources, to provide efficient utilization of an unlicensed or shared band.

[0878] That is, it is clear that a system that provides an omnidirectional antenna system with in band signaling and control, is inefficient as compared to a system which directs its transmitted energy only in the direction of the intended target, and does not intrude on a high capacity physical transport medium with relatively low information content signaling packets.

[0879] In a real time telematics ad hoc network with potentially unlimited data communication requirements, network congestion is almost guaranteed, in a continuous network of mobile nodes. RF interference issues will likely prevent network capacity from scaling with node density. Therefore, an alternate to CSMA was sought that provided more graceful degradation under high load, sensitivity to the importance of information to be communicated, and efficient utilization of the communications medium.

[0880] In order to optimize the network, additional information is employed, although this imposes a burden of increased protocol overhead, complexity, and potential loss privacy. One way to remedy selfish behavior is to increase the cost of acting this way, that is, to impose a cost for access to the network. In a practical implementation, however, this is problematic, since under lightly loaded conditions, the "value" of the communications may not justify a fixed cost which might be reasonable under other conditions, and likewise, under heavier loads, critical communications may still be delayed or impeded. Therefore, a variable cost, dependent on relative "importance", may be imposed. In determining this relative importance, a market evaluation, requires a comparison, termed an auction, is employed. In a multihop network, such an auction is complicated by the requirement for distributing payments among the chain of nodes along the route, with each node having potential alternate demands for its cooperation and resources. According to a more sophisticated analysis, one must also compensate nodes not directly involved in the communication for their deference.

[0881] In a scenario involving a request for information, the auction is complicated by the fact that the information resource content is unknown to the recipient, and therefore the bid is blind, that is, the value of the information to the recipient is indeterminate. However, game theory supports the communication of a value function or utility function, which can then be evaluated at each node possessing information to be communicated, to normalize its value. Fortunately, it is a dominant strategy in a VCG auction to communicate a truthful value. In this case, a value function may instead be communicated, which can then be evaluated at each node possessing information to be communicated. In a mere request for information conveyance, such as the transport nodes in a multihop network, or in a cellular network infrastructure extension model, the bid may be a true (re-

solved) value, since the information content is not the subject of the bidding; rather it is the value of the communications per se, and the bidding node can reasonably value its bid.

[0882] In a cellular network infrastructure extension model, the bid may represent a resolved value, since the information content is not the subject of the bidding; rather it is the value of the communications per se. In the case of voice, however, the communications are bidirectional and enduring, thus raising quality of service and handoff issues.

[0883] Game theory is most readily applied in the optimization of communications routes through a defined network, to achieve the best economic surplus allocation. That is, the problem of determining the network topology, and the communications themselves, are ancillary, though real, applications of game theory. Since the communications incidental to the arbitration require consideration of some of the same issues as the underlying communications, corresponding elements of game theory may apply at both levels of analysis. Due to various uncertainties, the operation of the system is stochastic. This presumption, in turn, allows estimation of optimality within a margin of error, simplifying implementation as compared to a rigorous analysis without regard to statistical significance.

[0884] The VCG auction is postulated as being optimal for allocation of multiple resources between agents. It is “strategyproof” and efficient, meaning that it is a dominant strategy for agents to report their true valuation for a resource, and the result of the optimization is a network which maximizes the value of the system to the agents.

[0885] Game theory also allows an allocation of cost between various recipients of a broadcast or multicast. That is, in many instances, telematic information is of value to a plurality of nodes, and a large set of recipient nodes may efficiently receive the same information. This allocation is a direct extension of VCG theory.

[0886] The preferred method for acquiring an estimate of the state of the network is through use of a proactive routing protocol. Thus, in order to determine the network architecture state, each node must broadcast its existence, and, for example, a payload of information including its identity, location, itinerary (navigation vector) and “information value function”. Typically, the system operates in a continuous state, so that it is reasonable to commence the process with an estimate of the state based on prior information. Using an in-band or out-of-band propagation mechanism, this information must propagate to a network edge, which may be physically or artificially defined. If all nodes operate with a substantially common estimation of network topology, only deviations from previously propagated information need be propagated.

[0887] CSMA is proposed for the protocol-related communications because it is relatively simple and robust, and well suited for ad hoc communications in lightly loaded networks. An initial node transmits using an adaptive power protocol, to achieve an effective transmit range of somewhat less than about two times the estimated average inter-nodal distance. This distance therefore promotes propagation to a set of neighboring nodes, without unnecessarily interfering with communications of non-neighboring nodes and therefore allowing this task to be performed in parallel. Neighboring nodes also transmit in succession, providing sequential and complete protocol information propagation over a relevance range.

[0888] If we presume that there is a spatial limit to relevance, for example, 5 miles or 10 hops, then the network state propagation may be so limited. Extending the network to encompass a large number of nodes will necessarily reduce the tractability of the optimization. Each node has a local estimate of relevance. This consideration is accommodated, along with a desire to prevent exponential growth in protocol-related data traffic, by receiving an update from all nodes within a node’s network relevance boundary, and a state variable which represents an estimate of relevant status beyond the arbitrarily defined boundary. The propagation of network state may thus conveniently occur over a finite number of hops, for example 5-10.

[0889] Under conditions of relatively high nodal densities, the system may employ a zone strategy, that is, proximate groups of nodes are treated as an entity for purposes of external state estimation, especially with respect to distant nodes or zones. Such a presumption is realistic, since at extended distances, geographically proximate nodes may be modeled as being similar or inter-related, while at close distances, and particularly within a zone in which all nodes are in direct communication, internode communications may be subject to mutual interference, and can occur without substantial external influence. Alternately, it is clear that to limit latencies and communication risks, it may be prudent to bypass neighboring nodes, thus trading latency for power consumption and overall network capacity. Therefore, a hierarchical scheme may be implemented to geographically organize the network at higher analytical levels, and geographic cells may cooperate to appear externally as a single entity.

[0890] A supernode within a zone may be selected for its superior capability, or perhaps a central location. The zone is defined by a communication range of the basic data interface for communications, with the control channel having a longer range, for example at least double the normal data communications range. Communications control channel transmitters operate on a number of channels, for example at least 7, allowing neighboring zones in a hexagonal tiled array to communicate simultaneously without interference. In a geographic zone system, alternate zones which would otherwise be interfering may use an adaptive multiplexing scheme to avoid interference. All nodes may listen on all control channels, permitting rapid propagation of control information.

[0891] In order to effectively provide decentralized control, either each node must have a common set of information to allow execution of an identical control algorithm; or nodes defer to the control signals of other nodes without internal analysis for optimality. A model of semi-decentralized control is also known, in which dispersed “supernodes”, are nominated as master, with other topologically nearby nodes remaining as slave nodes. In the pure peer network, complete information conveyance to each node is required, imposing a relatively high overhead. In a master-slave (or supernode) architecture, increased reliance on a single node trades-off reliability and robustness (and other advantages of pure peer-to-peer networks) for efficiency. A supernode within a cellular zone may be selected for its superior capability, or perhaps is at a central location or is immobile. Once each control node (node or supernode) has an estimate of network topology, the next step is to optimize network channels. According to VCG theory, each agent has an incentive to broadcast its truthful value or value function for the scarce resource, which in this case, is control over communications physical layer, and or access to information. This communication can be consoli-

dated with the network discovery transmission. Each control node then performs a combinatorial solution for the set of simultaneous equations according to VCG theory (or extensions thereof). This solution should be consistent between all nodes, and the effects of inconsistent solutions may be resolved by collision sensing, and possibly an error/inconsistency detection and correction algorithm specifically applied to this type of information.

[0892] As part of the network mapping, communications impairment and interference sources are also mapped. GPS assistance may be particularly useful in this aspect. Where interference is caused by interfering communications, the issue is a determination of a strategy of deference or competition. If the interfering communication is continuous or unresponsive, then the only available strategy is competition. On the other hand, when the competing system uses, for example, a CSMA system, such as 802.11, competition with such a communication simply leads to retransmission, and therefore ultimately increased network load, and deference strategy may be more optimal (dominant), at least and until it is determined that the competing communication is incessant. Other communications protocols, however may have a more or less aggressive strategy. By observation of a system over time, its strategies may be revealed, and game theory permits composition of an optimal strategy.

[0893] The optimization process produces a representation of an optimal network architecture during the succeeding period. That is, value functions representing bids are broadcast, with the system then being permitted to determine an optimal real valuation and distribution of that value. Thus, prior to completion of the optimization, potentially inconsistent allocations must be prevented, and each node must communicate its evaluation of other node's value functions, so that the optimization is performed on a normalized economic basis. This step may substantially increase the system overhead, and is generally required for completion of the auction. This valuation may be inferred, however, for transit nodes in a multihop network path, since there is little subjectivity for nodes solely in this role, and the respective value functions may be persistent. For example, the valuation applied by a node to forward information is generally content and involved party independent.

[0894] A particular complication of a traffic information system is that the nature of the information held by any node is private to that node (before transmission), and therefore the valuation is not known until after all bids are evaluated. Thus, prior to completion of optimization, each node must communicate its evaluation of other nodes' value functions, so that the optimization is performed on an economic basis. This required step substantially increases the system overhead. This valuation may be inferred, however, for transit nodes in a multihop network path.

[0895] After the network usage is defined, compensation is paid to those nodes providing value or subjected to a burden (including foregoing communication opportunity) by those gaining a benefit. The payment is generally of a virtual currency, with no specific true value, although the virtual currency system provides a convenient method to tax the system.

[0896] Exerting external economic influences on the system may have various effects on the optimization, and may exacerbate differences in subjective valuations. The application of a monetary value to the virtual currency substantially also increases the possibility of misbehavior and external attacks. On the other hand, a virtual currency with no assessed

real value is self-normalizing, while monetization leads to external and generally irrelevant influences as well as possible arbitrage. External economic influences may also lead to benefits, which are discussed in various papers on non-zero sum games.

[0897] In order to provide fairness, the virtual currency (similar to the so-called "nuglets" or "nuggets" proposed for use in the Terminodes project) is self-generated at each node according to a schedule, and itself may have a time dependent value. For example, the virtual currency may have a half-life or temporally declining value. On the other hand, the value may peak at a time after generation, which would encourage deference and short term savings, rather than immediate spending, and would allow a recipient node to benefit from virtual currency transferred before its peak value. This also means that long term hoarding of the currency is of little value, since it will eventually decay in value, while the system presupposes a nominal rate of spending, which is normalized among nodes. The variation function may also be adaptive, but this poses a synchronization issue for the network. An external estimate of node wealth may be used to infer counterfeiting, theft and failure to pay debts, and to further effect remediation.

[0898] The currency is generated and verified in accordance with micropayment theory. Micropayment theory generally encompasses the transfer of secure tokens (e.g., cryptographically endorsed information) having presumed value, which are intended for verification, if at all, in a non-real time transaction, after the transfer to the recipient. The currency is circulated (until expiration) as a token, and therefore is not subject to immediate authentication by source. Since these tokens may be communicated through an insecure network, the issue of forcing allocation of payment to particular nodes may be dealt with by cryptographic techniques, in particular public key cryptography, in which the currency is placed in a cryptographic "envelope" addressed to the intended recipient, e.g., is encrypted with the recipient's public key, which must be broadcast and used as, or in conjunction with, a node identifier. This makes the payment unavailable to other than the intended recipient. The issue of holding the encrypted token hostage and extorting a portion of the value to forward the packet can be dealt with by community pressure, that is, any node presenting this (or other undesirable) behavior might be ostracized. The likelihood of this type of misbehavior is also diminished by avoiding monetization of the virtual currency.

[0899] This currency generation and allocation mechanism generally encourages equal consumption by the various nodes over the long term. In order to discourage consumption of bandwidth, an external tax may be imposed on the system, that is, withdrawing value from the system base on usage. Clearly, the effects of such a tax must be carefully weighed, since this will also impose an impediment to adoption as compared to an untaxed system. On the other hand, a similar effect use-disincentive may be obtained by rewarding low consumption, for example by allocating an advertising subsidy between nodes, or in reward of deference. In a model telematics system, an audio and/or visual display provides a useful possibility for advertising and sponsorship; likewise, location based services may include commercial services.

[0900] Each node computes a value function, based on its own knowledge state, risk profile and risk tolerance, and wealth, describing the value to it of additional information, as well as its own value for participating in the communications

of others. The value function typically includes a past travel history, future travel itinerary, present location, recent communication partners, and an estimator of information strength and weakness with respect to the future itinerary. It may be presumed that each node has a standard complement of sensors, and accurately acquired descriptive data for its past travel path. Otherwise, a description of the available information is required. One advantage of a value function is that it changes little over time, unless a need is satisfied or circumstances change, and therefore may be a persistent attribute.

[0901] Using the protocol communication system, each node transmits its value function (or change thereof), passes through communications from neighboring nodes, and may, for example transmit payment information for the immediate-past bid for incoming communications.

[0902] Messages are forwarded outward (avoiding redundant propagation back to the source), with messages appended from the series of nodes. Propagation continues for a finite number of hops, until the entire community has an estimate of the state and value function of each node in the community. Advantageously, the network beyond a respective community may be modeled in simplified form, to provide a better estimate of the network as a whole.

[0903] After propagation, each node evaluates the set of value functions for its community, with respect to its own information and ability to forward packets. Each node may then make an offer to supply or forward information, based on the provided information. In the case of multihop communications, the offers are propagated to the remainder of the community, for the maximum number of hops, including the originating node. At this point, each node has a representation of the state of its community, with community edge estimates providing consistency for nodes with differing community scopes, the valuation function each node assigns to control over portions of the network, as well as a resolved valuation of each node for supplying the need. Under these circumstances, each node may then evaluate an optimization for the network architecture, and come to a conclusion consistent with that of other members of its community. If supported, node reputation may be updated based on past performance, and the reputation applied as a factor in the optimization and/or externally to the optimization. As discussed above, a VCG-type auction is employed as a basis for optimization. Since each node receives bid information from all other nodes within the maximum node count, the VCG auction produces an optimized result.

[0904] Transmissions are made in frames, with a single bidding process controlling multiple frames, for example a multiple of the maximum number of hops. Therefore, the bid encompasses a frame's-worth of control over the modalities. In the event that the simultaneous use of, or control over, a modality by various nodes is not inconsistent, then the value of the respective nodes may be summed, with the resulting allocation based on, for example, a ratio of the respective value functions. As a part of the optimization, nodes are rewarded not only for supporting the communication, but also for deferring their own respective needs. As a result, after controlling the resources, a node will be relatively less wealthy and less able to subsequently control the resources, while other nodes will be more able to control the resources. The distribution to deferred nodes also serves to prevent pure reciprocal communications, since the proposed mechanism distributes and dilutes the wealth to deferring nodes.

[0905] Because each node in the model presented above has complete information, for a range up to the maximum node count, the wealth of each node can be estimated by its neighbors, and payment inferred even if not actually consummated. (Failure of payment can occur for a number of reasons, including both malicious and accidental). Because each hop adds significant cost, the fact that nodes beyond the maximum hop distance are essentially incommunicado is typically of little consequence; since it is very unlikely that a node more than 5 or 10 hops away will be efficiently included in any communication, due to the increasing cost with distance, as well as reduction in reliability and increase in latency. Thus, large area and scalable networks may exist.

[0906] Typically, cryptography is employed for both authentication and to preserve privacy. External regulation, in a legal sense at least, is typically imposed by restrictions on hardware and software design, as well as voluntary compliance at risk of detection and legal sanction.

IX. Conclusion

[0907] The use of game theory as a basis for analyzing ad hoc networks provides a basis for understanding the behavior of complex networks of independent nodes. By presuming a degree of choice and decision-making by nodes, we obtain an analysis that is robust with respect to such considerations.

[0908] The principal issues impeding deployment are the inherent complexity of the system, as well as the overhead required to continuously optimize the system. Further work will allow a determination of a set of simplifying presumptions to reduce protocol overhead and reduce complexity.

[0909] The ad hoc network does not exist in a vacuum. There are various competing interests seeking to use the same bandwidth, and technological superiority alone does not assure dominance and commercial success. Game theory may also be used as a tool to analyze the entities which seek to deploy ad hoc networks, especially where they compete.

[0910] The present invention therefore provides an automated negotiation for control of a set of resources by competing bidders and, offerors, comprising receiving, from each of a plurality of bidders, a utility function representing a value to the bidder to obtain of a set of resources; receiving, from each of a plurality of offerors, a utility function representing a value to the offeror to relinquish a set of resources; computing a set of successful bids from the plurality of bidders and plurality of offers, a successful bid comprising a matching of a maximum aggregate value of the sets of resources to the bidders and a minimum aggregate value of the sets of resources to the offerors, wherein the maximum aggregate value of bids equals or exceeds the minimum aggregate value of offers; and receiving for each set of resources from a bidder placing a respective successful bid a Vickrey price, and paying to for each set of resources to an offeror of a respective successful bid each its offer price, with any surplus being allocated to bidders based on a value bid. The bidder utility function may be evaluated based on private information of an offeror, and communicated as a normalized value.

EXAMPLE 3

[0911] According to a further aspect of the invention, it is desired to understand the subjective risk aversion profile of a person. Risk-aversion is a significant deviation from rationality which can be quantified and understood, and further a calculus is available for applying the risk aversion to normal-

ize systems in which rationality is presumed. Accordingly, the method comprises presenting a game for play by a person, wherein the payoff of the game is real and beneficial to the person. That is, the incentive and risk must be real, with some limits on the ability to extrapolate beyond the scope of risk presented. The person is then sufficiently observed during the game play to comprehend a risk aversion profile of the user. Typically, the game is automated, but this is not required, and, in fact, a competition between two or more players is possible. This scenario is generally quite beneficial where the stakes of the game are identical or similar to the risk aversion personality attribute sought to be defined. The comprehended risk aversion profile may then be used to modify a rationality expectation for the person. The modified rationality expectation may then be applied to optimize an interaction with the person outside of the game play environment.

[0912] This process is particularly useful for creating a user-agent to act on behalf of the user, in a manner commensurate with a subjective profile of the user, or to subjectivize a presentation of risk data to a user. For example, in the probability based user interface discussed above, the event-probability map may be analyzed based on the subjective risk tolerance of the user, and the output optimized accordingly. This method may also be applied for optimally pairing a user with another person or process, based on compatibility.

[0913] There has thus been shown and described novel communications devices and systems and methods which fulfill all the objects and advantages sought therefor. Many changes, modifications, variations, combinations, subcombinations and other uses and applications of the subject invention will, however, become apparent to those skilled in the art after considering this specification and the accompanying drawings which disclose the preferred embodiments thereof. All such changes, modifications, variations and other uses and applications which do not depart from the spirit and scope of the invention are deemed to be covered by the invention, which is to be limited only by the claims which follow.

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What is claimed is:

1. A method of determining a subjective profile of a person, comprising:
 - presenting a game for play by the person, wherein the payoff of the game is real and beneficial to the person;
 - sufficiently observing the game play involving the person to comprehend a risk aversion profile of the person;
 - employing the comprehended risk aversion profile to modify a rationality expectation for the person.
2. The method according to claim 1, wherein the modified rationality expectation is applied to optimize an interaction with the person outside of the game play environment.
3. The method according to claim 1, wherein the risk aversion profile is employed to normalize a system in which rationality is presumed.
4. The method according to claim 1, further comprising normalizing a system to compensate for the risk aversion profile.
5. The method according to claim 1, wherein the game is conducted by an automated processor.
6. The method according to claim 1, wherein the game comprises stakes similar to a non-game situation, and wherein the risk aversion profile derived from play of the game by the person is employed to modify a rationality expectation for the person in the non-game situation.
7. The method according to claim 1, wherein the risk aversion profile is employed in a user-agent which acts on behalf of the user.

8. The method according to claim 1, wherein the risk aversion profile is employed to subjectivize a presentation of risk data to a user.

9. The method according to claim 1, wherein the risk aversion profile is employed to optimize a presentation of objects associated with different risks to a user.

10. The method according to claim 1, wherein the risk aversion profile is employed to match the person with another person or process, based on a presumed compatibility.

11. A system configured to determine a subjective profile of a person, comprising:

an interactive interface configured for use by a person to play a game, the game comprising a risk and a payoff beneficial to the person;

an automated processor configured to monitor sufficient play of the game to derive a risk aversion profile of the person;

a memory configured to store the risk aversion profile; and an output port configured to communicate a signal in dependence on the risk aversion profile.

12. The system according to claim 11, wherein the automated processor is further configured to employ the derived risk aversion profile to modify a rationality expectation for the person.

13. The system according to claim 12, wherein the modified rationality expectation is applied with respect to a circumstance outside of the game, to optimize an interaction with the person outside of the game play environment, wherein the game comprises a beneficial payoff to the person.

14. The system according to claim 11, wherein the game represents a model of an interaction involving a plurality of people, and wherein the risk aversion profile derived from play of the game by the person is employed to modify a rationality expectation for the person in the interaction.

15. The system according to claim 11, wherein the automated processor is configured to employ the risk aversion profile to provide a user-agent which acts on behalf of the user.

16. The system according to claim 11, wherein the automated processor is configured to employ the risk aversion profile to optimize a presentation of objects associated with different risks to a user.

17. The system according to claim 11, wherein the automated processor is configured to employ the risk aversion profile to match the person with another person or process, based on a presumed compatibility.

18. A method of generating a user subjective risk aversion profile, comprising:

repeatedly playing a game between an automated processor and the user, the game comprising a range of statistical risks and rewards;

sufficiently observing the game play involving the person to generate a predictive risk aversion profile for the user; employing the predicted risk aversion profile to normalize an expectation for the person outside of the game.

19. The method according to claim 18, wherein the game is an auction, and wherein an automated processor employs the predicted risk aversion profile to bid in an auction on behalf of the user.

20. The method according to claim 19, wherein the auction comprises a multi-part auction.

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