



(11) **EP 1 393 136 B1**

(12) **EUROPEAN PATENT SPECIFICATION**

(45) Date of publication and mention
of the grant of the patent:
18.02.2009 Bulletin 2009/08

(51) Int Cl.:
G05B 9/02 ^(2006.01) **G01N 33/26** ^(2006.01)
G01D 1/18 ^(2006.01)

(21) Application number: **02717225.3**

(86) International application number:
PCT/NO2002/000160

(22) Date of filing: **26.04.2002**

(87) International publication number:
WO 2002/088850 (07.11.2002 Gazette 2002/45)

(54) **METHOD FOR MONITORING AND DETECTING SENSOR FAILURE IN OIL AND GAS
PRODUCTION SYSTEM**

VERFAHREN ZUR UBERWACHUNG UND ZUM ERKENNEN EINES SENSORAUSFALLS IN ÖL-
UND GASPRODUKTIONSSYSTEMEN

PROCEDE DE SURVEILLANCE ET DE DETECTION DE DEFAILLANCE D'UN CAPTEUR DANS UN
SYSTEME DE PRODUCTION DE PETROLE ET DE GAZ

(84) Designated Contracting States:
**AT BE CH CY DE DK ES FI FR GB GR IE IT LI LU
MC NL PT SE TR**

(30) Priority: **26.04.2001 US 286600 P**

(43) Date of publication of application:
03.03.2004 Bulletin 2004/10

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Description

FIELD OF THE INVENTION

[0001] The present invention relates to production systems for the production of oil and gas, and in particular to the validation of sensors installed in such systems for measuring physical properties of the flow through the production system.

BACKGROUND OF THE INVENTION AND PRIOR ART

[0002] Oil and gas production systems typically contain sensors for measuring physical properties of the flow. Sensor measurements in the production system are for instance used as input (initial values) for simulations of the reservoir.

[0003] A well-known problem in the oil industry is that sensors in the production system become inaccurate, or even fail completely, after some time in operation. The problems are mainly due to the harsh conditions under which such equipment is operated, such as the high pressure, the high temperature, or the corrosive environment present in the production system.

[0004] New oil wells are being equipped with sensors increasingly often. An example of a sensor that is being used in an oil and gas production system is a venturi down-hole flow meter, such as disclosed in WO 01/22041. A venturi down-hole flow meter is a sensor that in itself comprises several sensors such as pressure sensors. It is getting more and more common to install venturi down-hole flow meters in new wells. Venturi down-hole flow meters feed other parts of the production system with essential information: the values from venturi down-hole flow meters are essential for critical functions such as well allocation.

[0005] An example of a flow meter based on a process model of an oil well implemented in a data processing system is the software product Wellocate™ (currently known as OptimizeIT Well Monitoring System) supplied by ABB AS of Billingstad, Norway, the assignee of the present application. A paper, "Oil Well Allocation: the Ultimate Interpolation Problem" (L.T. Biegler, A. Bramilla, C. Scali, G. Marchetti (editors), Advanced Control of Chemical Processes 2000, Elsevier, 2001) describes how Wellocate™ identifies the flow rate in an oil well by checking the consistency of an assumed flow rate with the observed pressure and temperature drop over the tubing and the production choke in an oil well.

[0006] The sensors in the production system constitute an integral part of the operating philosophy of the oil field and the work routines of the oil field operator. Therefore, it would be beneficial to be able to detect whether a sensor is trustworthy or whether it fails.

[0007] A common approach to this has been to define a set of allowable values for a particular sensor. Such an allowable set of values may be constant over time, e.g., the operator may specify a minimal and a maximal value.

The allowable set may also depend on historical measurement data, e.g., the operator may specify a maximal rate of change. Unfortunately, it is often very difficult if not impossible to specify an allowable set of values. On the one hand, the set must have a limit that is small enough or sensitive enough to discriminate between correct and incorrect readings of a particular sensor other than those indicating complete failure of the equipment. Further, the allowable set must have a range large enough to accommodate for a wide variety of possible operating conditions of the system, which can be considerable in number and extent.

[0008] WO 02/46848 (as published on 13 June 2002) describes an example of such an approach, relating to tracking systems for detecting errors in sensor outputs of a wide range of machines, such as gas turbine engines.

[0009] Further prior art related to systems and methods for detection of sensor failures are as follows.

[0010] US-A-5 764 509 relates to a system for monitoring an industrial process, and in particular a system for monitoring the function of sensors supplying information on the process. The system estimates "learned" values for a sensor within a limited range of time correlated data, and compares these values with actual sensor values. If a sensor is faulty, its output is substituted with a "learned" value. The "learned" values are taken from a previous training session of normal training data in a normally operated system, i.e. the "learned" values are solely based on historical data. This general system is applicable to a lot of different applications, such as petrochemical (refineries), power generation, automotive, manufacturing, medical, aeronautical, financial, etc., and thus requires historical data that in addition is only taken over a certain period of time on a normally operated system to establish a set of modelled data. The modelled data is generated and processed to identify a pattern for the data. In order to be widely and generally applicable, the system does not use a current or an actual model of the system and does not rely on analytical modelling by itself.

[0011] WO 99/57417 discloses a system for remote actuation of downhole tools employing chemical taggants, and a method for detecting inflatable tool failure. When a tool has failed, the inflatable tool releases a chemical taggant, indicating the failure. By choosing separate taggants for separate tools there is a way to identify which tool that has failed. The identification of the tool may initiate actions. The chemical sensors may be employed singly, in groups of different chemical sensors or in groups with sensors for other types of parameters such as pressure, temperature and flow rate.

[0012] WO 99/34187 A1 relates to a particular method for monitoring a pressure sensor in a fuel supply system, such as in fuel injection systems for internal combustion engines which operate with very high injection pressures. The method determines a pressure in a pressure accumulator regulated by a pressure actuator and includes the steps of calculating an expected pressure value in

the pressure accumulator for a given point in time based on a holding pressure preset by the pressure actuator and based on a detected rate of change in a mass balance of a medium contained in the pressure accumulator. A pressure value in the pressure accumulator is determined with the pressure sensor at the given point in time. The expected pressure value is compared with the determined pressure value and a fault in the pressure sensor is detected if the pressure values deviate from each other beyond a predetermined value, wherein the faulty sensor is physically substituted.

[0013] US-A-4 249 238 relates to a gas turbine engine control system, which maintains a selected level of engine performance despite the failure or abnormal operation of one or more engine parameter sensors. The control system employs a continuously updated engine model which simulates engine performance and generates signals representing real time estimates of the engine parameter sensor signals. The estimate signals are transmitted to a control computational unit which utilizes them instead of the actual engine parameter sensor signals to control the operation of the engine. The estimate signals are also compared with the corresponding actual engine parameter sensor signals and the resulting difference signals are utilized to update the engine model. If a particular difference signal exceeds specific tolerance limits, the difference signal is inhibited from updating the model and a sensor failure indication is provided to the engine operator.

[0014] JP 06 229 791 A relates to an abnormality diagnostic method which can determine an abnormal machine or sensor in a plant or machinery. A machine model and an actuator model calculate a first prediction data similar to the detection data of a selected sensor based on detection data from three other sensors. Another machine model and another actuator model calculate a second prediction data of the selected sensor based on the detection data of two of the other three sensors. A diagnostic section then compares the detection data of the selected sensor, the first prediction data, and the second prediction data with each other and combine the comparison results to diagnose abnormality in all of the sensors.

[0015] JP 59 005 913 A relates to a method for facilitating the detection of abnormality by judging the output value of sensors as abnormal when the difference between the value of least squares which are estimated by a specific determinant equation and the output value of the sensors is a specified value or more in an unspecified process.

[0016] WO 97/07439 describes a statistical method for detecting a faulty sensor within a process control system having a set of sensors, each of which produces an associated sensor output signal. The method produce a set of sensor estimate signals from the sensor output signals using principal component analysis and then determine a validity index for each of the sensors as a ratio of two residuals, wherein each of the residuals represents a dif-

ferent measure of the difference between the sensor output signals and the sensor estimate signals. The determined validity indexes are then used to detect a failure of one of the sensors and/or to identify which one of the sensors has failed.

[0017] EP-A-0 362 011 relates to a method of analyzing a multi-phase fluid flowing along a hydrocarbon well in order to determine, at each depth, the average static proportion of one of the phases by means of a local measurement performed by one or more sensors.

[0018] Another problem related to failing sensors is that, unfortunately, it is often prohibitively expensive to replace such sensors by new ones. This is particularly true when the sensors are installed in remote locations in the production system, such as down in a well or on the bottom of the sea or other body of water. Therefore, it would also be beneficial to have a back-up value or reading available instead of the sensor itself for monitoring purposes when the sensor fails. A possible solution to this problem is to install multiple sensors of the same kind close to each other in the production system in order to obtain redundancy. In case any one of the sensors fails, one of the other sensors may be used to supply the data. This approach is costly and inefficient, since multiple sensors are involved to do the work of one. Another drawback of this approach is that such sensors of the same kind may be subject to the same errors due to the same well conditions.

SUMMARY OF THE INVENTION

[0019] An object of the present invention is to provide a method that solves the above-mentioned problems.

[0020] This object is achieved by the present invention by a method for detecting sensor failure in an oil and gas production system according to claim 1.

[0021] The present invention provides a method performed in a data processing system for detecting sensor failure in an oil and gas production system. The method is performed under control of a set of computer-readable instructions contained in a computer program storage device. With the present invention, an expected value for a measurement from a sensor in the production system is generated. The expected value is compared against an actual measurement. If the expected value is within some acceptable specified limit of the actual measurement, the validity of the actual measurement is confirmed. If such is not the case, a failure of the sensor is indicated. The invention provides a model-based method for generating an expected, or back up, value for a measurement from a specific sensor. This expected value is the value that is most consistent with the measurements from the other sensors in the system. The model used in the invention comprises descriptions of subsystems of the entire production system.

[0022] In preferred embodiments, the method includes one or several of the following steps:

- generating an expected value by means of one or more generated back-up values, the back-up values primarily being generated by means of the process simulation model;
- generating an expected value for a sensor measurement comprising the step of obtaining a probability distribution of expected values for the sensor measurement;
- obtaining a probability distribution of expected values comprising the step of performing multiple simulations of the oil and gas production system using the other sensors in the production system than the first sensor over a range of possible sensor readings from the other sensors;
- obtaining a probability distribution of expected values comprising the step of performing multiple simulations of the oil and gas production system using a range of model parameters for the production system;
- making a probability distribution of measured sensor values available, wherein the step of comparing the expected output value with an actual measurement comprising the step of obtaining a probability distribution of the difference between the expected value and the actual measurement obtained from the sensor;
- comparing the expected output value with an actual measurement from the sensor (first sensor) comprising the step of obtaining the acceptable specified limits for the difference between the expected value and the actual measurement by means of the probability distribution of the difference between the expected value and the actual measurement.

[0023] The present invention also provides a computer program product directly loadable into the internal memory of a computer, comprising computer readable instructions for causing a data processing system to monitor for sensor failure in an oil and gas production system, computer program product comprising software for performing the steps of the appended claim 1.

BRIEF DESCRIPTION OF THE DRAWINGS

[0024]

Figure 1 is a schematic diagram of a typical offshore oil field in which the present invention is used.

Figure 2 is a schematic diagram of a venturi down-hole flow meter with on-board computing capability used in the oil field of Fig. 1.

Figure 3 is a schematic diagram of the venturi down-hole flow meter with on-board computing capability of Fig. 2 in place in an oil well.

Figure 4 is a data plot showing a comparison between the down-hole pressure measured by a down-hole pressure sensor (gauge) and the corresponding estimated pressure according to an embodiment of the invention.

Figure 5 is a schematic diagram of a directed graph representing an example oil and gas production system.

Figure 6 is a flow chart indicating the basic steps of an operating sequence for detecting and correcting sensor failure in an oil and gas production system according to the present invention.

Figure 7 shows a flow chart of steps performed by a data processing system implementing the second basic step of the present invention of Fig. 6.

Figure 8 is an example of a graph showing a probability distribution for a calculated sensor value and a probability distribution for the corresponding measured sensor value.

DESCRIPTION OF THE PREFERRED EMBODIMENT

[0025] In the drawings, an example oil and gas production system S is shown in Figure 1. The system S contains the typical components of a production system for the production of oil and gas, such as wells, flowlines, manifolds, risers, and topside facilities, as well as systems for gas-lift and systems for the injection of chemicals. These elements comprise basic components for guiding, controlling, and observing the flow such as pipes, joints, bends, chokes, valves, pumps, separator tanks, heat exchangers, pressure gauges, temperature gauges, (multi-phase) flow meters, densitometers, and water cut meters.

[0026] The system S includes a production platform M in a body of water 12 connected to a set of wells, as shown schematically at 13 and 14 beneath a subsurface floor 15 in the body of water 12. The wells 13 and 14 are connected together through a set of flowlines 16, manifolds 18 and risers 19. The production system further contains a vessel 10 for the injection of chemicals. As is conventional, a number of sensors 22 are located in the production system S. Such sensors include pressure gauges, temperature gauges, multi-phase flow meters, densitometers, and water cut meters. These sensors are connected to a subsea control system or computer 17, which in its turn is connected to a topside control system or computer P.

[0027] The sensors 22 send readings or measurements as indicated schematically to a process control

system or computer P operating under control of an operator station O and exchanging sensor readings and results as indicated schematically at 26 and 28. A well monitoring data processing system W in communication with the operator station O also exchanges instructions as indicated at 30 and receives sensor readings as indicated at 32 from the process control system O. The well monitoring system W and process control system P may be, for example, the Wellocate™ system of the type available from ABB, the assignee of the present application. According to the present invention, a computer program product C operating under a sequence of instructions described below causes the well monitoring data processing system W to monitor for failure of sensors 22.

[0028] Flow models in oil and gas production systems of the conventional type operate based on measurements obtained from the sensors 22. It is well known that the flow rate in an oil well may be found by measuring the pressure drop and/or the temperature drop over certain parts of the well and by identifying the flow rate that is most consistent with the measured pressure and/or temperature drop according to a model of the flow.

[0029] An example of a sensor 22 in Figure 1 may be a downhole model-based flow meter 23 shown schematically in Figure 2. The flow meter 23 is available, for example, from the Expro International Group, PLC in the UK under the name SUREFLO down-hole flow meter. The flow meter 23 includes a contracting tube (a Venturi tube) 34 inside tubing 36 in the production system S, and a down-hole pressure gauge 38. Pressure and temperature gauges 40 and 42 are located on both ends of tube 34. The down-hole flow meter 23 in Figure 2 operates according to a model of the pressure drop over the Venturi tube 34 as a function of the flow rate (the Venturi equation). Further, such a down-hole flow meter 23 in Figure 2 has an embedded computer 44 in order to facilitate certain calculations. Such a flow meter in Figure 2 measures the pressure drop over the tube 34 and determines the flow rate by identifying the rate that is most consistent with the observed pressure drop according to the Venturi equation.

[0030] With the present invention a simulation is used to calculate previously unknown flow rates. The method of the present invention further uses those calculated flow rates to validate sensor measurements and further replace measurements from failed sensors in an oil and gas production system S.

[0031] A well 48 of the type in the production system S is shown in Figure 3 including a tubing 50 contained in an annulus 52. Production enters the well 50 through the perforations in the inflow 54. On the wellhead 56 on the seabed 15 the production is contained by a production choke 58. The well is equipped with a down-hole venturi flow meter 23 as in Figure 2, a wellhead pressure and temperature gauge 60 and a downstream pressure and temperature gauge 62. The down-hole flow meter is according to Figure 2, including pressure/temperature gauges 38, 40, and 42 and a flow computer 44 for cal-

culating the flow rate of oil and water.

[0032] The present invention involves the following three phases as indicated schematically in Fig. 6.

[0033] Phase 1: Configuration: In the configuration phase 70 a user of the method of the present invention chooses and identifies which portion of the system S is to be monitored according to the present invention.

[0034] Phase 2: Simulation/Operation: In the simulation or operation phase 72 a number of steps are performed to obtain a simulated solution to the problem that the user has configured in configuration phase 70.

[0035] Phase 3: Analysis/Presentation: In the analysis or presentation phase 74 the results of the simulation or operation phase 72 are analyzed and presented to the user. It is in this phase that the system creates the most benefit for the user.

Phase 1: Configuration Phase:

[0036] In the configuration phase 70, the user of the invention sets up the problem that is to be solved. Configuration phase 70 according to the present invention involves choosing the following items in a group of steps:

- 1) The relevant part of the production system S under consideration for the problem at hand.
- 2) The number of distinguishable fluids of interest in the relevant part of the production system S selected in step 1) .
- 3) For each of the fluids identified in step 2), a characterization of the composition.
- 4) For each of the fluids in step 2), an indication as to whether the flow rate of the fluid through the system S is a known variable, an unknown variable, or a function of another variable in the system S.
- 5) The division of the relevant part of the production system S selected in step 1) into a suitable number of subsystems for which elementary flow models exist.
- 6) For each of the subsystems selected in step 5), which flow model out of a set of possible flow models is to be used to best represent the behavior of the flow through the subsystem in question.
- 7) For each of the flow models chosen in step 6), which values for the model parameters are to be used so that the model best represents the behavior of the flow through the subsystem in question.
- 8) Which measured flow properties in the system S are assumed a priori to be trustworthy, and which measured flow properties are assumed a priori to be flawed.

9) Which of the measured flow properties assumed a priori to be trustworthy in step 8) are to be subject to a consistency check by the present invention.

10) For each of the flow properties chosen in step 9), the specification of an interval to validate the measured flow property prior to the operation of the invention.

11) For each of the flow properties chosen in step 9), the specification of a test to determine whether the measured and the estimated flow property are consistent with each other or not.

12) Which of the measured flow properties assumed a priori to be flawed during step 8) are to be estimated by the present invention.

13) The point in time on which the system is supposed to operate.

[0037] These choices of steps 1) through 13) do not have to be made in the stated order as long as they are consistent with each other.

[0038] The relevant part of the production system S must be a connected subsystem of the production system S. Examples of such subsystems are a single oil well, a cluster with a number of wells, or the entire production system. Even though the present example is about the solution of a single problem in a single part of the production system S, it will be appreciated that the process of one or more instances of the present invention may be made concurrently in order to tackle various problems at the same time. Such multiple use of the invention may be seen as the repeated use of a single instance of the invention for a single problem as described in this example.

[0039] A preferred embodiment of the invention is embedded in an oil and gas production administrative system W, such as shown according to Figure 1, which allows for the specification of a comprehensive production system from which connected subsystems may be selected for processing by the invention. The surrounding administrative system W also allows for repeated and parallel execution of multiple versions of the present invention.

[0040] Without loss of generality it is possible to identify at least one fluid of interest in the system S. To illustrate, it is customary in the oil industry to distinguish at least one oil (e.g., oil from a certain appraisal zone in the reservoir), possibly one or more gases (e.g., gas associated with the oil, free gas from a gas cap, injected lift gas), and possibly one water (e.g., an aquifer), from every well in an oil field.

[0041] In the preferred embodiment of the present invention a user defines a number of sources, that is, a number of points where fluids enter the production system S. Each of these sources allows for the specification

of at most three distinguishable fluids, at most one oil, at most one gas, and at most one water.

[0042] There exist two common ways to describe the characterizing properties of such fluids:

1) The black oil fluid model distinguishes between oil, gas, and water. A fluid is described by means of the gas-oil-ratio and the water cut. The oil is characterized by its API gravity, the gas is characterized by its relative density, and the water is characterized by its density, all at standard conditions.

2) The compositional fluid model distinguishes between individual chemical components in the fluid. These components may be pure substances (e.g., methane, carbon dioxide) of which all relevant properties are known, or they may be hypothetical substances for which the density at standard conditions and the molecular weight is specified. The fluid is characterized by the mole fraction of the various components together with the fraction of water.

[0043] In the preferred embodiment of the present invention the compositional fluid model is used to describe the fluids of interest in the production system. There are a number of models based on an equation of state that describe the physical properties of flow characterized by a compositional fluid model. In the preferred embodiment of the invention the model by Peng and Robinson (R.C. Reid, J.M. Prausnitz, B.E. Poling, The Properties of Gases & Liquids, McGraw-Hill Book Co, 1988) is used to calculate such flow properties.

[0044] A user is in principle free to choose which flow rates are unknown variables to be determined by the invention in operation or simulation phase 72 and which flow rates are known variables or functions of other variables. To illustrate the foregoing, it is typical in the oil industry to assume that the rate of oil from a well is either an unknown variable, or a function of the difference in pressure between the reservoir and the down-hole pressure in the well bore, and, as such, a function of an other variable in the system, the down-hole pressure. To give another example, it is typical to assume at least in the short term that the rate of gas in an oil well without a gas cap is a constant fraction of the rate of oil.

[0045] It is important to note that there typically is a limit on the total number of unknown variables that the present invention can estimate in operation or simulation phase 72, based on the total number of independent, trustworthy measured flow properties identified in step 8) as previously described.

[0046] For all relevant components in an oil production system S such as shown in Figure 1, there is at least one model available in the literature to describe the flow through the component with a certain degree of accuracy, based on the granularity of the division of the system into subsystems. The optimal model of a production system is the one with a minimal number of subsystems that provides an acceptable degree of accuracy for the range

of expected flow conditions.

[0047] The measurements assumed a priori to be trustworthy are the known reference points for the simulation in phase 2. It is important that there are enough of such reference points.

Phase 2: Simulation/Operation Phase

[0048] The operation phase 72 is composed of three steps:

Step 1: Data Collection: In the Data Collection step of the simulation/operation phase 72, data from the sensors 22 in the relevant part of the production system S selected in the configuration phase 70 is collected for the point in time selected in the configuration phase 70.

Step 2: Data Validation: In the Data Validation step of the simulation/operation phase 72, the measured data is validated according to the a priori rules for validation of data that the user has selected in the configuration phase 70. As a result of this data validation step, a flag is set for all sensors in the selected part of the production system S indicating whether the associated measured physical property of the flow is believed to be valid prior to operation of the invention.

Step 3: Simulation: In the Simulation step of the simulation/operation phase 72, the flow in the selected subsystem is simulated at the selected point in time on the basis of the collected data by using the constituted simulation model of the production system. In the simulation step of operation phase 72 the present invention determines the value of relevant flow properties in the relevant part of the production system S, based on the choices made in phase 70.

[0049] Simulating the flow in the production system S is in effect knowing the value of all the relevant properties of the flow through the system. Without loss of generality, it suffices to know a set of characterizing properties of the flow, that is, a set of basic properties of the flow from which all other properties may be derived by means of models. In the preferred embodiment of the present invention, track is kept of the pressure, the temperature, the flow rate, and the composition of the flow. It should be noted that this is merely one possible set of characterizing properties: another characterizing set would be the pressure, the enthalpy, the flow rate, and the composition of the flow.

[0050] For practical applications, it is only necessary to know flow properties in a limited number of selected locations in order to obtain an impression of the behavior of the flow everywhere in the system. Therefore in the preferred embodiment of the invention the simulation phase estimates the characterizing flow properties at the

inlet and at the outlet of every subsystem of the production system identified during the configuration phase 70.

[0051] In the preferred embodiment of the present invention the production system is represented as a directed graph, where the edges represent the basic flow containing components, where the direction of the edges represents the designated direction of flow, and where the vertices represent the components where the flow containing components are linked together, as well as the locations of the sensors in the system. The locations where flow enters the system or where it flows out of the system, known as sources and sinks in graph theory, are also represented as vertices.

[0052] In the preferred embodiment of the present invention the relevant part of the production system is represented as a directed graph for the purpose of the simulation portion of phase 72. The following elements in the relevant part of the production system S are represented in a directed graph:

1. the sources, that is, the locations where fluids flow into the system;
2. the sinks, that is, the locations where fluids flow out of the system;
3. the manifolds, that is, the locations where more than one flow get commingled;
4. the routers and separators, that is, the locations where the flow is split into more than one flow; and
5. the sensors, that is, the locations where at least one flow property is being measured.

[0053] Figure 5 shows a directed graph G representing an oil and gas production system. The main structure of a directed graph such as shown in Figure 5 includes leaves 80, nodes 82, branches 84, and a root 86. The leaves 80 in directed graph tree of Figure 5 represent the sources in the oil and gas production system S, that is, points where oil and gas enters the production system S. A source may be an inflow, that is, a hole in the tubing down in a reservoir through which oil/gas enters the production network. It may be an inlet into a pipeline with a given pressure and/or flow rate. A source may also be a gas injection point in a gas-lifted well, as well as other locations of inflow into various types of wells. The word source must be read in the designed direction of flow, since there are circumstances where production flows back from the production facilities into a source. The direction of flow of the oil and gas from the sources to a separator is represented by the direction in the tree from the leaves to the root.

[0054] Nodes 82 in the directed graph tree of Figure 5 may represent reference points and further represent what are known as manifolds in the oil industry. A manifold is a blending point where the flow from a number of

inlet flow lines comes together and continues its way through a single outlet flow line. A reference point is a point where some piece of information is available, such as a measured value of the pressure, the temperature, or the flow rate, or some constant value, such as the pressure in a separator.

[0055] A branch 84 in directed graph G represents the flow lines that comprise a sequence of pipes and chokes. The root 86 is the most downstream node in the network, in the sense that all production eventually arrives to the root. The root in a directed graph that describes an entire oil and gas production system typically represents an inlet to a separator.

[0056] The edges in the directed graph G of Figure 5 represent the basic flow containing components in between these vertices and the direction of the edges indicates the designated direction of flow.

[0057] There is a unique directed graph associated with any production system, but it should be understood that the use of a directed graph is not the only method available to build a model suitable for simulation according to the present invention of the production system S.

[0058] In the preferred embodiment of the present invention, the production system S is modeled as a linked list of components that is derived from a directed graph. Each component is modeled as a list of parameters of the component. Such sets of parameters refer to elementary models of such components that are available to the system in the form of a library of models. There are many ways to model flow in elementary flow containing components such as pipes and chokes. The preferred embodiment of the invention contains common models such as:

a mechanistic model for pressure drop in pipes based on mass, energy, and momentum balances, as described in the previously mentioned paper entitled "Oil Well Allocation: the Ultimate Interpolation Problem,"

a mechanistic model for the pressure drop in chokes known as the Perkins model, as described in the previously mentioned paper entitled "Oil Well Allocation: the Ultimate Interpolation Problem,"

a heat transfer model between the flow in pipes and the environment based on an overall heat transfer coefficient, as described in the previously mentioned paper entitled "Oil Well Allocation: the Ultimate Interpolation Problem,"

[0059] It is important to note that these models are examples of models that describe the behavior of flow in elementary flow containing components and that they may be replaced by other models from the literature or devised on the basis of experiments on the equipment. It is also important to note that for many of the physical processes involved there is no such thing as an exact

model since the processes are too complicated to be fully understood. However, the available models in the literature, including the models mentioned above, have shown to be reasonably accurate and at least accurate enough for the purpose of this invention.

[0060] In the simulation step of operation phase 72, the present invention tries and solves a system of equations in order to find previously unknown properties of the flow on the basis of previously known properties of the flow. There are many ways to solve such a system of equations. The following is a description of the preferred embodiment of the invention.

[0061] The variables in the system are the pressure, the temperature, the flow rate, and the composition of the flow in all the vertices of the directed graph that represents the production system. The equations that need to be observed are the physical models for pressure and temperature drop over the edges of the graph as described above. In addition there are a large number of what is known as constitutional relations in the graph:

The pressure in all edges into and out of a vertex is identical.

The flow out of a vertex is the sum of the flows into a vertex.

The main steps in the simulation step 72 are as follows (see Figure 7):

1. During a step 72a, some of the variables are known due to measurements that have been validated, other variables are unknown.

2. Next, during step 72b, a solution process or technique performed in the data processing system as described below assumes the value of some of the unknowns, such as the flow rates from all the sources and the pressure in all the vertices.

3. Then, during step 72c, the unknowns in the graph are calculated in the direction of the graph on the basis of known values and the available models.

4. During step 72d, when all unknowns are known in this iteration step, the mismatches between calculated values and values that were known due to measurements, as well as the mismatch between calculated values and the constitutional relations in the graph are collected and assembled.

5. If these mismatches are determined to be under a pre-specified level during step 72e, the simulation is done as indicated at step 72f. Otherwise the mismatch is used by the solution

technique to assume better values and start over in step 72b.

[0062] The computation of the calculated values is based on a system of ordinary differential equations (ODEs) describing the behavior of the pressure and the temperature along a pipe with a multi-component, multi-phase fluid. In addition, models for the change in pressure and temperature across other equipment such as venturi down-hole flow meters and chokes are evaluated. The ODEs are non-linear and they are based on conservation of energy, mass, and momentum along the pipe. Evaluation of the derivatives defining the ODEs involves thermodynamic equilibrium calculations for each fluid component at each integration point along the pipe. Integration of the ODEs along the pipes, together with evaluation of the models for the rest of the equipment, gives the pressure, the temperature, and other physical quantities like velocities, densities, and viscosities at all points of interest in a fluid transport pipe network.

[0063] The preferred embodiment of the invention uses a state-of-the-art solution technique for a system of nonlinear equations. A state of the art method for the solution of nonlinear least-squares problems is for example the Levenberg-Marquardt method. Techniques of this type are described, for example, in the following literature:

1. Marquardt, D. (1963), "An algorithm for least-squares estimation of nonlinear parameters, SIAM Journal on Applied Mathematics", 11, 431-441.
2. Dennis, J.E., Jr., and Robert B. Schnabel (1983), Numerical Methods for Unconstrained Optimization and Nonlinear Equations, Prentice-Hall, Englewood Cliffs, New Jersey.
3. Gill, Philip E., Walter Murray, and Margaret Wright (1981), Practical Optimization, Academic Press, New York.

Phase 3: Analysis/Presentation Phase

[0064] The Presentation or Analysis Phase 74 includes in general several actions. For the available sensors, the mismatch is registered between the simulated and the measured value of the property of the flow. For all unavailable sensors, the simulated value is registered in order to replace the unavailable measured value of the property of the flow.

[0065] In the analysis phase 74, the simulated flow properties obtained during operation phase 72 are compared with the measured flow properties selected in configuration phase 70. This is done in order to check the consistency of these measured flow properties. In the analysis phase 74 a method according to the present invention also supplies estimated flow properties. Those flow properties are results of simulations made in phase

72 as a replacement of the results from the failed sensors indicated in configuration phase 70.

[0066] This is done according to the present invention based on probability distribution of measurement values and model parameters for the sensors. Figure 8 shows an example of a graph representing probability distribution of a sensor, such as the devices described above in the production system S. Such devices measure any of the following properties of a fluid inside a pipe or any other pressure containing equipment: absolute pressure, differential pressure (e.g. used in venturi tubes), temperature, density (e.g. nucleonic densitometers), phase fractions (e.g. fluid dielectricity, capacitance and impedance meters), molecular compositions, salinity (e.g. with conductivity meters and or nucleonic densitometers), velocity and momentum.

[0067] The detection of sensor error according to the present invention is based on a comparison of the probability distribution of the value for the calculated sensor value (calculated during the simulation phase 72 with the probability distribution of the measured sensor value. This is illustrated in Figure 8, which is an example with normal distributions for both. The wider probability distribution indicated at 90 is the calculated sensor value during the simulation phase 72, while the more narrow distribution indicated at 92 is the probability distribution for the sensor to be validated.

[0068] An important observation to make at this point is that the definition of a probability distribution or confidence interval for the deviation between an estimated flow property and a measured flow property is a completely different task than the definition of a confidence interval for the measured flow property as such, as is done in the prior art. It is to be expected that an educated guess of a certain flow property based on trustworthy observations is a considerably more selective benchmark, hence, that the confidence interval for the deviation is typically much smaller than the confidence interval required for the measured flow property as such. One example of a criterion for valid sensor is that the "union area" is larger than a certain limit.

[0069] The probability distribution 90 of the calculated sensor value is found with the present invention by performing multiple simulations with the process simulation model for the sensors other than the test sensor to be validated, which is not used for the simulation. The process simulation model measured sensor values with a probability distribution (error) added to each sensor and using model parameters with errors added to each of the main model parameters. The probability distribution 92 of the measured value for each sensor is defined or may be obtained from the data available from the vendor of the particular sensor.

[0070] In a preferred embodiment the present invention also defines and presents the expected error distribution for a back-up value of a sensor based on a calculated error distribution. This is done by what can be termed validating a sensor model parameter.

[0071] It can be assumed that every sensor and every model parameter has a known variance. Then the variance of the simulated value or soft sensor value can be estimated. Once these variances are known any sensor may be validated.

[0072] For this purpose, one can define

$$y = u - m ,$$

where u is the simulated value and m is the measured value from the sensor which is to be tested. The variance of y is then

$$Var(y) = Var(u) + Var(m) ,$$

since the simulated value u and the measured value m are uncorrelated. A further assumption is that both the simulated value and the measured value are distributed according to a Gauss probability function. In that case one may perform the following validation test:

[0073] Let the result of a specific measurement and the corresponding simulation be

$$u = u_0$$

$$m = m_0$$

$$y = y_0 = u_0 - m_0 .$$

[0074] Let P_0 be the probability that the values are as above or more extreme ($|y| > |y_0|$), given that the expected value of y is zero (in which case the expected value for u and m is the same),

$$P_0 = P(|y| > |y_0| \mid E(y) = 0) .$$

[0075] The sensor cannot be trusted if $P_0 < \alpha$, where α is chosen in advance. A typical choice would be $\alpha = 5\%$, in which case the sensor would be rejected if $|y_0| \geq 2 * \sqrt{Var(y)} .$

Computing the variance of the simulated value

[0076] Let u be the simulated or back-up value obtained with the model parameters and sensor values $\alpha_1, \dots, \alpha_n$. All these values have known accuracies, given

by their variance. The variance (which is the square of the standard deviation) of sensor (or model parameter) α_i is denoted by $Var(\alpha_i)$. The simulated value may be written as some function of the parameters, i.e.

$$u = f(a_1, \dots, a_n) .$$

[0077] For a given set of parameters let the simulated value be denoted by u_0 ,

$$u_0 = f(a_1^*, \dots, a_n^*) .$$

[0078] Assume that locally u can be well approximated by a linear function such that

$$u \approx C + \sum_{i=1}^n x_i a_i ,$$

where x_i are coefficients to be determined. By perturbing one parameter at a time the unknown coefficients can be estimated in the following way:

$$u_0 \approx C + x_1 a_1^* + \sum_{i=2}^n x_i a_i^*$$

$$u_1 \approx C + x_1 (a_1^* + \varepsilon_1) + \sum_{i=2}^n x_i a_i^* .$$

[0079] Subtracting the two equations gives

$$u_1 - u_0 \approx x_1 \varepsilon_1 ,$$

from which x_1 may be found. This means that the coefficients are the partial derivatives of f with respect to each of the variables, i.e.

$$x_i = \left. \frac{\partial f}{\partial a_i} \right|_{a_i = a_i^*} .$$

[0080] Once the coefficients are determined, the variance of the simulated value is found in a standard way as

$$Var(u) \approx \sum_{i=1}^n x_i^2 Var(a_i)$$

[0081] If a certain sensor value is evaluated as being unreliable the calculated sensor value is used as back-up value. The back-up value can be sent to the control system to be used for control purposes or optimization.

Example on case:

[0082] As an example result, the foregoing analysis was performed on a sensor layout of the type shown in Figure 3. The relevant part of the production system S in this example runs from the pressure and temperature gauge 38 down-hole in Figure 3 to the well head pressure and temperature gauge 60 in Figure 3.

[0083] In this example there is only one relevant fluid flowing through the well, an oil with an unknown flow rate and a known composition.

[0084] The relevant part of the production system S is subdivided into the following subsystems; a lower tubing from the down-hole sensor 38 to the inlet of the venturi 40 in Figure 3; a venturi inlet tube from the gauge 40 to the gauge 42 in Figure 3;

a venturi outlet tube from the gauge 42 to the top of the venturi downhole flow meter 23 in Figure 3; and an upper tubing from the top of the venturi downhole flow meter 23 to the gauge 60 in Figure 3 in the well consisting of a number of pipe segments with different properties.

[0085] The measured flow properties in the relevant part of the production system are

(a) the pressure at the inlet to the venturi 40;

(b) the temperature at the inlet to the venturi 40;

(c) the pressure inside the venturi 42;

(d) the temperature inside the venturi 42;

(e) the flow rate of oil through the venturi;

(f) the pressure on the well head 60;

(g) the temperature on the well head 60;

[0086] A priori we assume that all of these properties are trustworthy. In addition we measure the downhole pressure 38 but we assume that this pressure is untrustworthy.

[0087] The flow rate of oil (e) is subject to a consistency check by the invention. This means that we use the invention to calculate (simulate) the flow rate of oil and then check whether the measured flow rate of oil (e) is consistent with the calculated flow rate of oil.

[0088] We also use the invention to check whether the downhole pressure is valid or not and we provide a back-up value for the down-hole pressure in cases where it is not valid.

5 [0089] Figure 4 shows a comparison between the measured downhole pressure 65 and the calculated downhole pressure 66 according to an embodiment of the invention. It is obvious that the sensor is severely flawed since measurements are only available at some point in time. The results show that the estimated pressure is very close to the measured pressure at times when the measured pressure is available. The estimated pressure provides a reliable back-up value for the down-hole pressure measurement at times when the sensor is not available.

Claims

1. A method for monitoring and detecting sensor failure in an industrial system (S) comprising a number of sensors (22), said method comprising the steps, performed in a data processing system (W), of:

- generating an expected output value for a first of said sensors,
- comparing the expected output value with an actual measurement obtained from the first sensor,
- confirming the validity of the actual measurement obtained if the expected output value is within acceptable specified limits of the actual measurement, and
- indicating the failure of the sensor, and replacing the value of the actual measurement with the expected value, if the expected value is not within the acceptable specified limits of the actual measurement,

characterized in

that the expected output value for the first of said sensors is generated based on a process simulation model of an oil and gas production system (S), said oil and gas production system (S) being a production pipe network, wherein the expected output value is the value that is most consistent with the measurements from at least one of the other sensors in the system,

that said sensors (22) are adapted for measuring physical properties of a multi-phase flow (16) throughout the production pipe network, and

that said process simulation model used is a model of said multi-phase flow in the production pipe network.

2. The method according to claim 1, wherein said expected value is generated by means of one or more generated back-up values, the back-up values pri-

marily being generated by means of the process simulation model.

3. The method according to claim 1 or 2, wherein the step of generating an expected value for a sensor measurement comprises the step of:

- obtaining a probability distribution (90) of expected values for the sensor measurement.

4. The method of claim 3, wherein the step of obtaining a probability distribution (90) of expected values comprises the step of:

- performing multiple simulations of the oil and gas production system (S) using the other sensors in the production system than the first sensor over a range of possible sensor readings from the other sensors.

5. The method of claim 4, wherein the step of obtaining a probability distribution (90) of expected values comprises the step of:

- performing multiple simulations of the oil and gas production system using a range of model parameters for the production system.

6. The method of claim 4 or 5, wherein a probability distribution (92) of measured sensor values is available and the step of comparing comprises the step of:

- obtaining a probability distribution of the difference between the expected value (90) and the actual measurement (92) obtained from the sensor.

7. The method of claim 6, wherein the step of comparing comprises the step of:

- obtaining the acceptable specified limits for the difference between the expected value and the actual measurement by means of said probability distribution of the difference between the expected value (90) and the actual measurement (92).

8. A computer program product (C) directly loadable into the internal memory of a computer, comprising computer readable instructions for causing a data processing system (W) to monitor for sensor failure in an oil and gas production system, the computer program product comprising software for performing the steps of claim 1 when executed in the computer.

Patentansprüche

1. Ein Verfahren zum Überwachen und Detektieren von Sensorstörung in einem industriellen System (S), das eine Zahl von Sensoren (22) umfasst, wobei das Verfahren die in einem Datenverarbeitungssystem (W) ausgeführten Schritte umfasst:

- Erzeugen eines erwarteten Ausgabewerts für einen ersten der Sensoren,
- Vergleichen des erwarteten Ausgabewerts mit einer tatsächlichen Messung, die von dem ersten Sensor erhalten wird,
- Bestätigen der Gültigkeit der tatsächlichen erhaltenen Messung, wenn der erwartete Ausgabewert innerhalb akzeptabler spezifizierter Grenzen der tatsächlichen Messung ist, und
- Hinweisen auf die Störung des Sensors und Ersetzen des Werts der tatsächlichen Messung mit dem erwarteten Wert, wenn der erwartete Wert nicht innerhalb akzeptabler spezifizierter Grenzen der tatsächlichen Messung liegt,

dadurch gekennzeichnet,

dass der erwartete Ausgabewert für den ersten der Sensoren basierend auf einem Prozesssimulationsmodell eines Öl- und Gasproduktionssystems (S) erzeugt wird, wobei das Öl- und Gasproduktionssystem (S) ein Produktionsrohrnetz ist, wobei der erwartete Ausgabewert der Wert ist, der am konsistentesten mit den Messungen von mindestens einem der anderen Sensoren in dem Systems ist, **dass** die Sensoren (22) geeignet zum Messen physikalischer Eigenschaften des Multiphasenflusses (16) überall in dem Produktionsrohrnetz sind, und **dass** das benutzte Prozesssimulationsmodell ein Modell des Multiphasenflusses in dem Produktionsrohrnetz ist.

2. Das Verfahren nach Anspruch 1, wobei der erwartete Wert mittels eines oder mehrerer erzeugter Back-up-Werte erzeugt wird, wobei die Back-up-Werte vorzugsweise mittels des Prozesssimulationsmodells erzeugt werden.

3. Das Verfahren nach einem der Ansprüche 1 oder 2, wobei der Schritt des Erzeugens eines erwarteten Werts für eine Sensormessung den Schritt umfasst:

- Erhalten einer Wahrscheinlichkeitsverteilung (90) von erwarteten Werten für die Sensormessung.

4. Das Verfahren nach Anspruch 3, wobei der Schritt des Erhaltens einer Wahrscheinlichkeitsverteilung (90) von erwarteten Werten den Schritt umfasst:

- Ausführen mehrerer Simulationen des Öl- und

- Gasproduktionssystem (S) unter Verwendung von anderen Sensoren als dem ersten Sensor in dem Produktionssystem über einen Bereich von möglichen Sensorangaben von den anderen Sensoren.
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5. Das Verfahren von Anspruch 4, wobei der Schritt des Erhaltens einer Wahrscheinlichkeitsverteilung (90) von erwarteten Werten den Schritt umfasst:
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- Ausführen mehrerer Simulationen des Öl- und Gasproduktionssystems unter Verwendung eines Bereichs von Modellparametern für das Produktionssystem.
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6. Das Verfahren nach einem der Ansprüche 4 oder 5, wobei eine Wahrscheinlichkeitsverteilung (92) von gemessenen Sensorwerten verfügbar ist und der Schritt des Vergleichens den Schritt umfasst:
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- Erhalten einer Wahrscheinlichkeitsverteilung der Differenz zwischen dem erwarteten Wert (90) und der tatsächlichen Messung (92), die von dem Sensor erhalten wird.
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7. Das Verfahren nach Anspruch 6, wobei der Schritt des Vergleichens den Schritt umfasst:
- Erhalten der akzeptablen spezifizierten Grenzen für die Differenz zwischen dem erwarteten Wert und der tatsächlichen Messung mittels der Wahrscheinlichkeitsverteilung der Differenz zwischen dem erwarteten Wert (90) und der tatsächlichen Messung (92).
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8. Ein Computerprogrammprodukt (C), das direkt in den internen Speicher eines Computers ladbar ist, und welches computerlesbare Instruktionen umfasst, um ein Datenverarbeitungssystem (W) zu veranlassen, Sensorstörung in einem Öl- und Gasproduktionssystem zu überwachen, wobei das Computerprogrammprodukt Software umfasst zum Ausführen der Schritte von Anspruch 1, wenn es in einem Computer ausgeführt wird.
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Revendications

1. Procédé pour surveiller et détecter une panne de capteur dans un système industriel (S) comprenant un nombre de capteurs (22), ledit procédé comprenant les étapes, exécutées dans un système de traitement de données (W), consistant à :
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- générer une valeur de sortie attendue pour un premier desdits capteurs,
 - comparer la valeur de sortie attendue à une mesure réelle obtenue au moyen du premier
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capteur,

- confirmer la validité de la mesure réelle obtenue si la valeur de sortie attendue se trouve dans des limites spécifiées acceptables de la mesure réelle, et
- indiquer la panne du capteur, et remplacer la valeur de la mesure réelle par la valeur attendue, si la valeur attendue ne se trouve pas dans les limites spécifiées acceptables de la mesure réelle,

caractérisé en ce que

la valeur de sortie attendue pour le premier desdits capteurs est générée d'après un modèle de simulation de processus d'un système de production de pétrole et de gaz (S), ledit système de production de pétrole et de gaz (S) étant un réseau de conduites de production, dans lequel la valeur de sortie attendue est la valeur qui est le plus en accord avec les mesures provenant d'au moins l'un des autres capteurs du système,

en ce que lesdits capteurs (22) sont adaptés pour mesurer les propriétés physiques d'un écoulement polyphasique (16) dans le réseau de conduites de production, et

en ce que ledit modèle de simulation de processus utilisé est un modèle dudit écoulement polyphasique dans le réseau de conduites de production.

2. Procédé selon la revendication 1, dans lequel ladite valeur attendue est générée au moyen d'une ou plusieurs valeurs de sauvegarde générées, les valeurs de sauvegarde étant essentiellement générées au moyen du modèle de simulation de processus.

3. Procédé selon la revendication 1 ou 2, dans lequel l'étape de génération d'une valeur attendue pour une mesure de capteur comprend l'étape consistant à obtenir une répartition de probabilités (90) de valeurs attendues pour la mesure de capteur.

4. Procédé selon la revendication 3, dans lequel l'étape d'obtention d'une répartition de probabilités (90) de valeurs attendues comprend l'étape consistant à effectuer plusieurs simulations du système de production de pétrole et de gaz (S) en utilisant les autres capteurs du système de production que le premier capteur sur une plage de lectures de capteurs possibles à partir des autres capteurs.

5. Procédé selon la revendication 4, dans lequel l'étape d'obtention d'une répartition de probabilités (90) de valeurs attendues comprend l'étape consistant à effectuer plusieurs simulations du système de production de pétrole et de gaz en utilisant une gamme de paramètres de modèle pour le système de production.

6. Procédé selon la revendication 4 ou 5, dans lequel une répartition de probabilités (92) de valeurs de capteur mesurées est disponible et l'étape de comparaison comprend l'étape consistant à obtenir une répartition de probabilités de la différence entre la valeur attendue (90) et la mesure réelle (92) obtenue au moyen du capteur. 5
7. Procédé selon la revendication 6, dans lequel l'étape de comparaison comprend l'étape consistant à obtenir les limites spécifiées acceptables pour la différence entre la valeur attendue et la mesure réelle au moyen de ladite répartition de probabilités de la différence entre la valeur attendue (90) et la mesure réelle (92). 10 15
8. Produit de programme informatique (C) pouvant être chargé directement dans la mémoire interne d'un ordinateur, comprenant des instructions lisibles par ordinateur pour faire surveiller par un système de traitement de données (W) les pannes de capteur dans un système de production de pétrole et de gaz, le produit de programme informatique comprenant un logiciel pour exécuter les étapes de la revendication 1 quand il est exécuté dans l'ordinateur. 20 25

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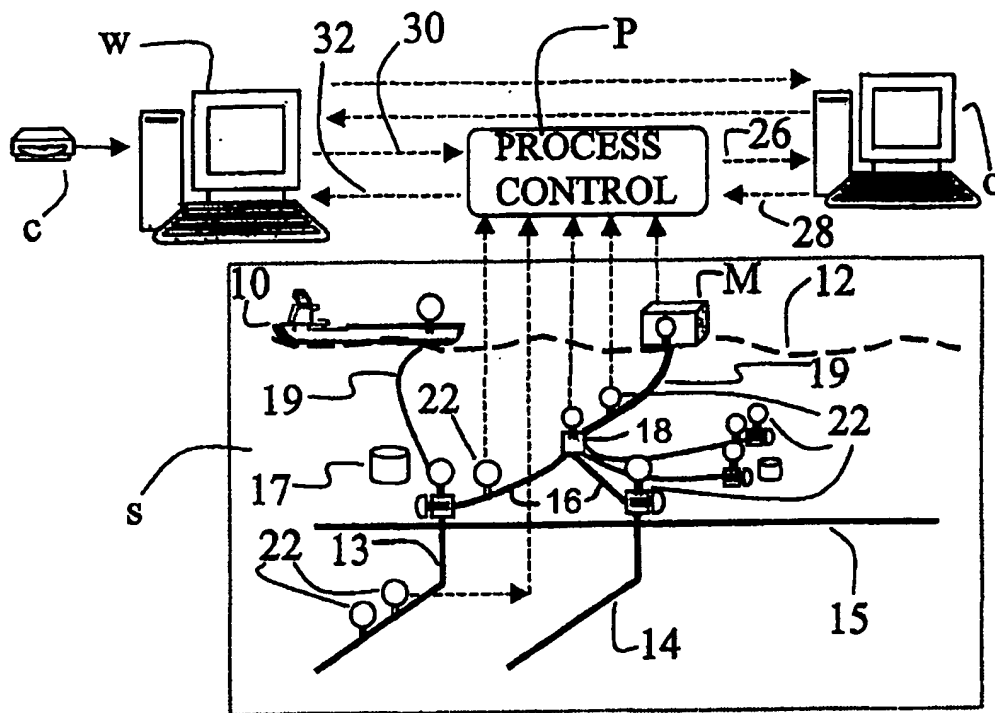


Fig. 1

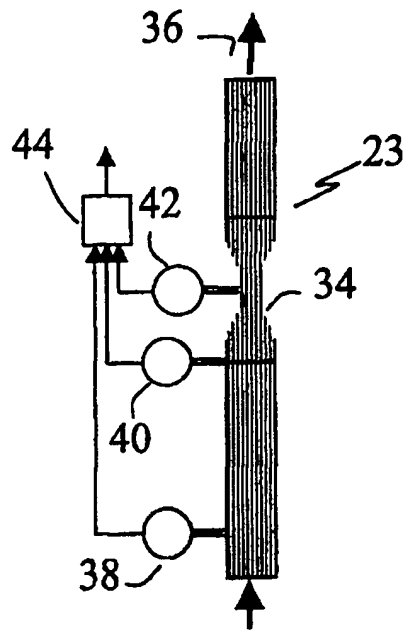


Fig. 2

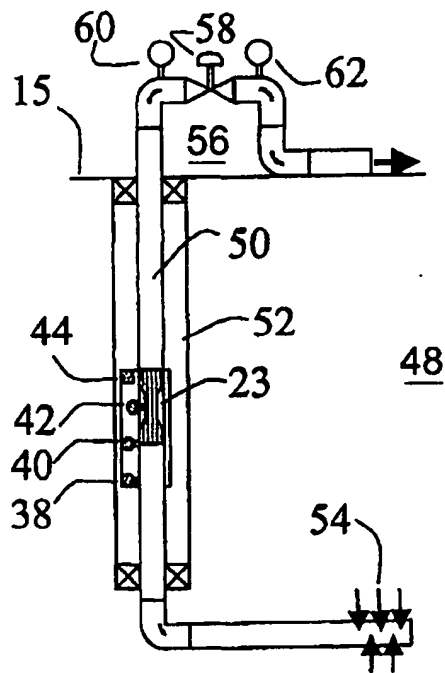


Fig. 3

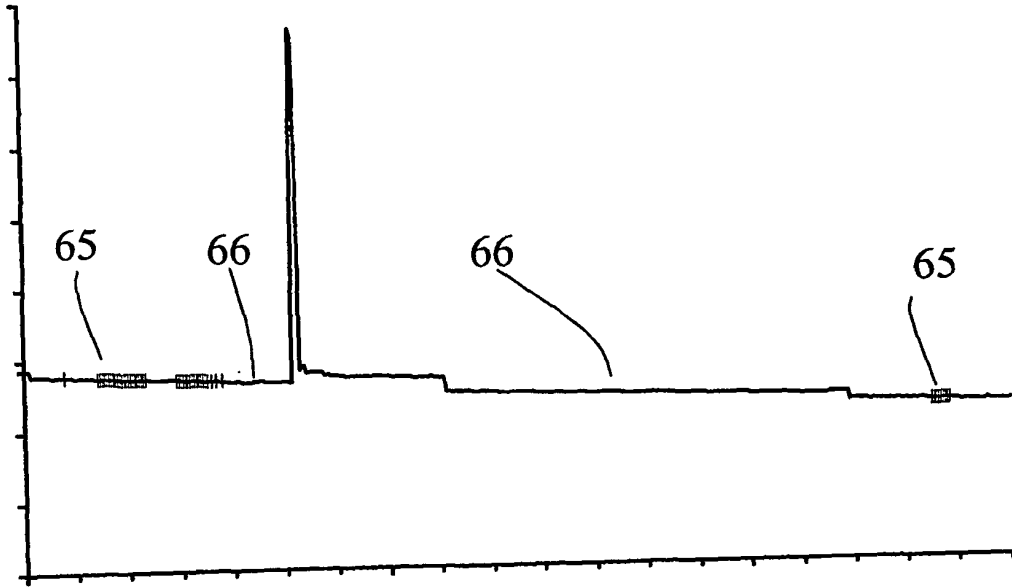


Fig. 4

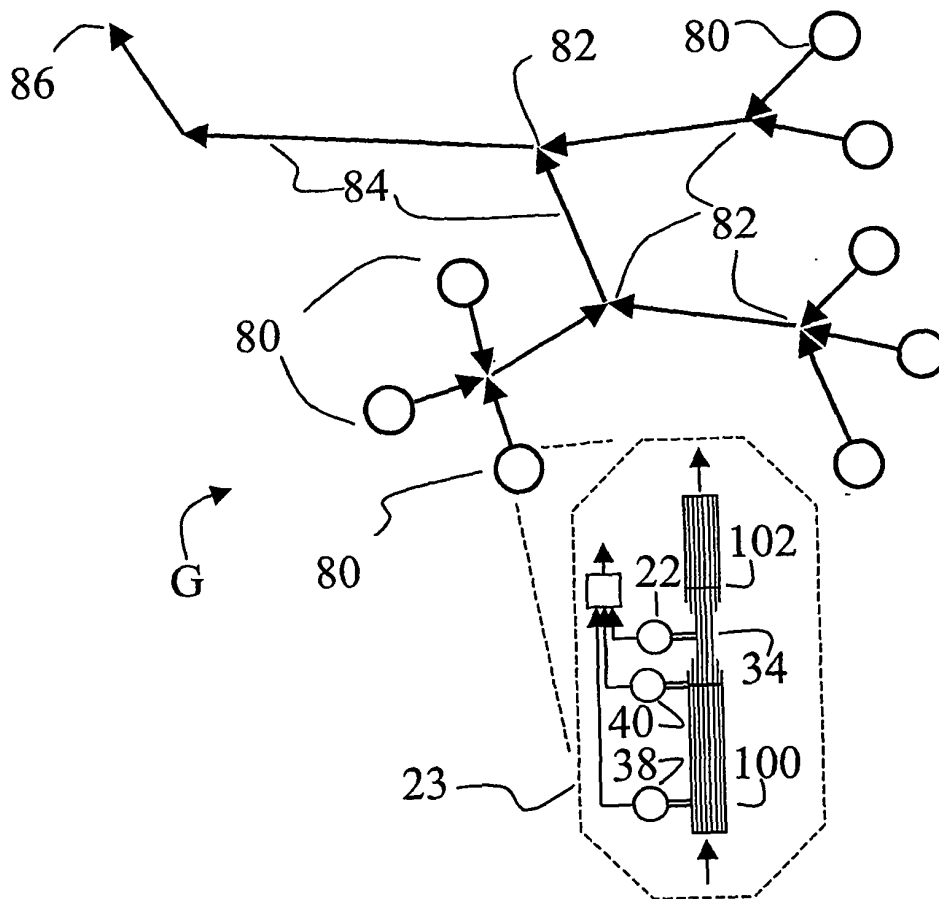


Fig. 5

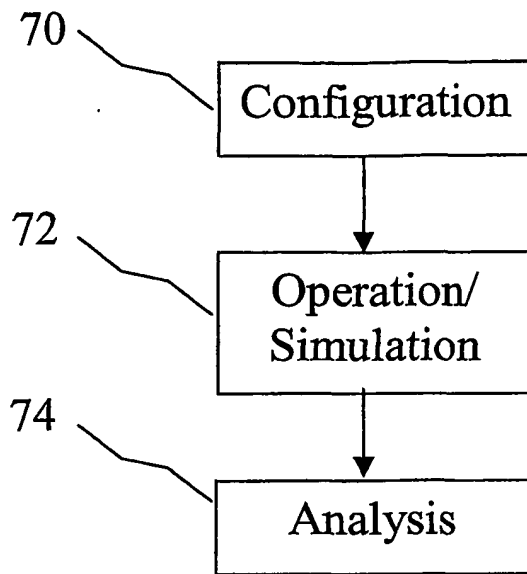


Fig. 6

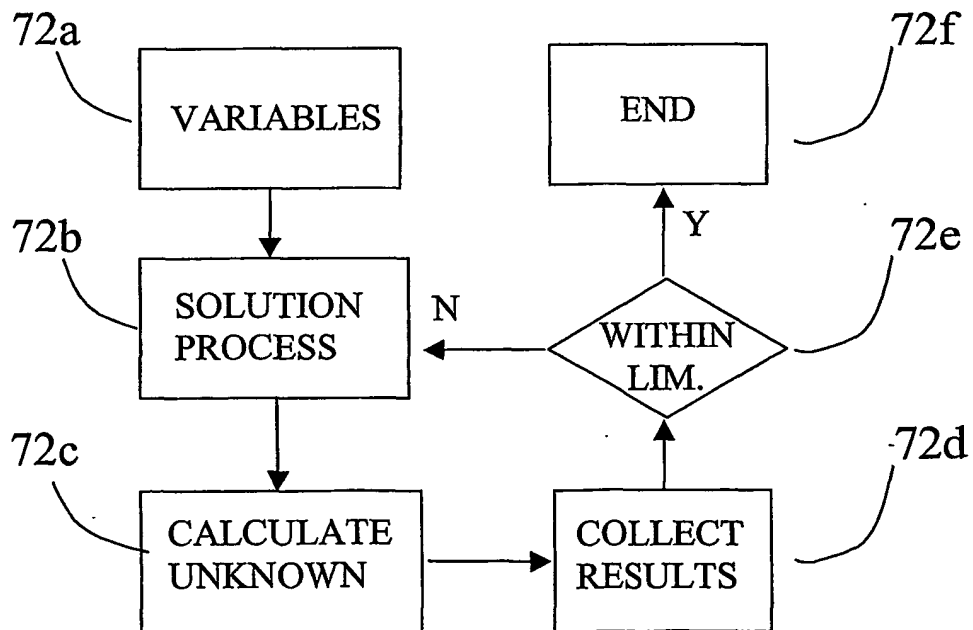


Fig. 7

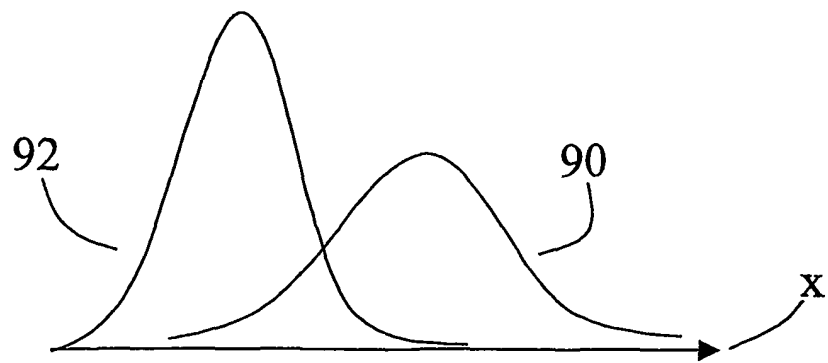


Fig. 8

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