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(54) **CUFF-LESS MULTI-SENSOR SYSTEM FOR STATISTICAL INFERENCE OF BLOOD PRESSURE WITH PROGRESSIVE LEARNING/TUNING**

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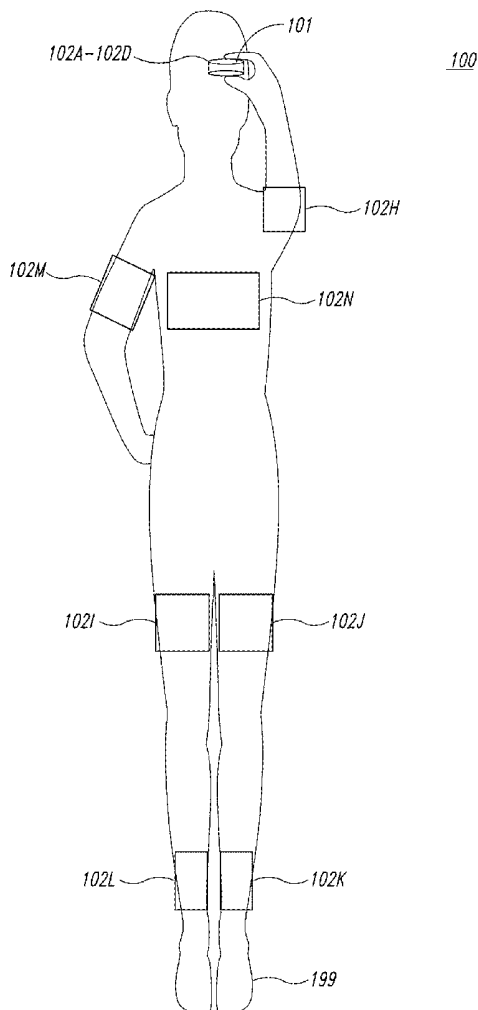
(57) **ABSTRACT**

In one embodiment of the invention, a cuff-less blood pressure measuring system is disclosed including cuff-less blood pressure scanner with a vital signs signal processor having an adaptive blood pressure model. A machine learning process is further disclosed to tune the adaptive blood pressure model of the cuff-less blood pressure measuring system to the user.

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(60) Provisional application No. 62/306,626, filed on Mar. 10, 2016.



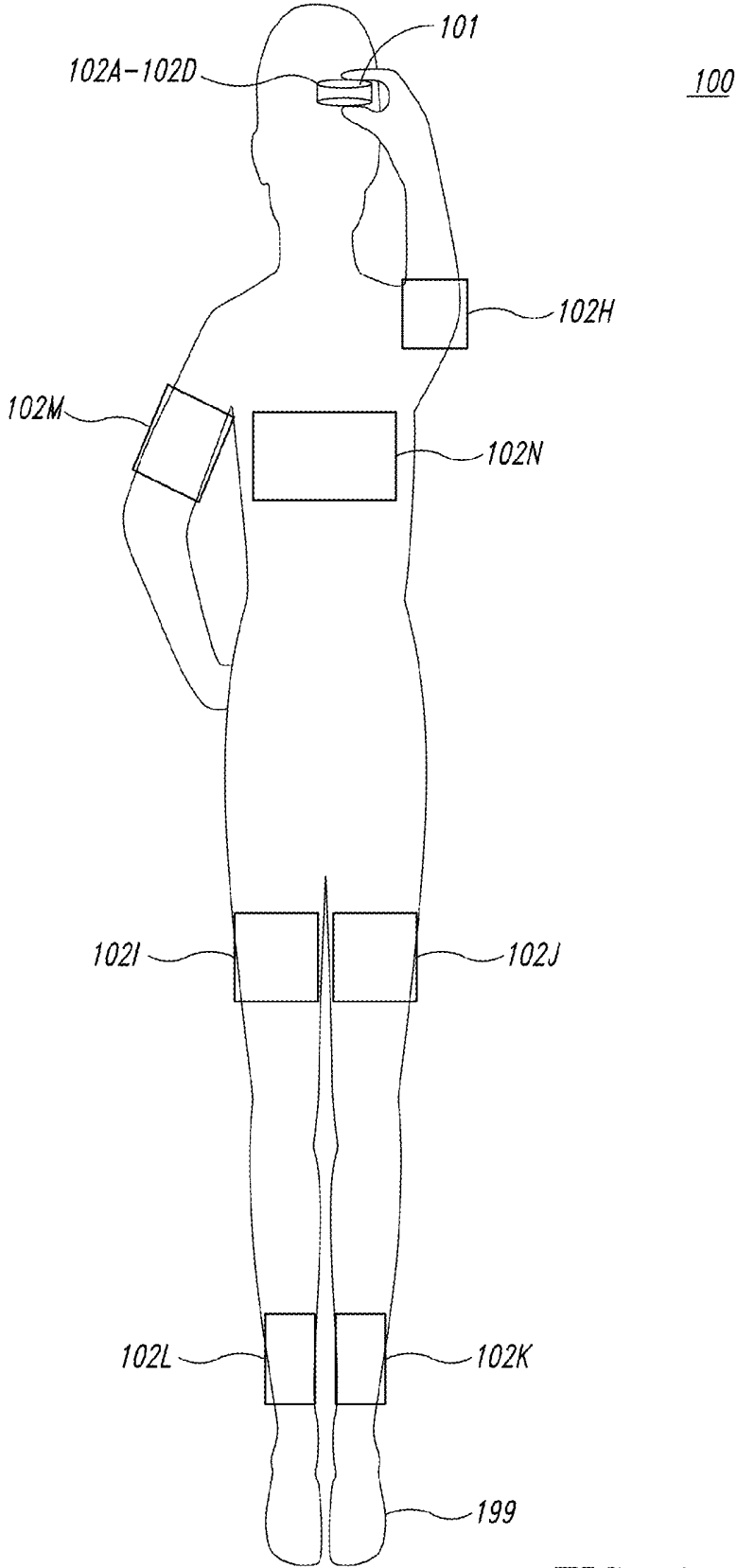


FIG. 1

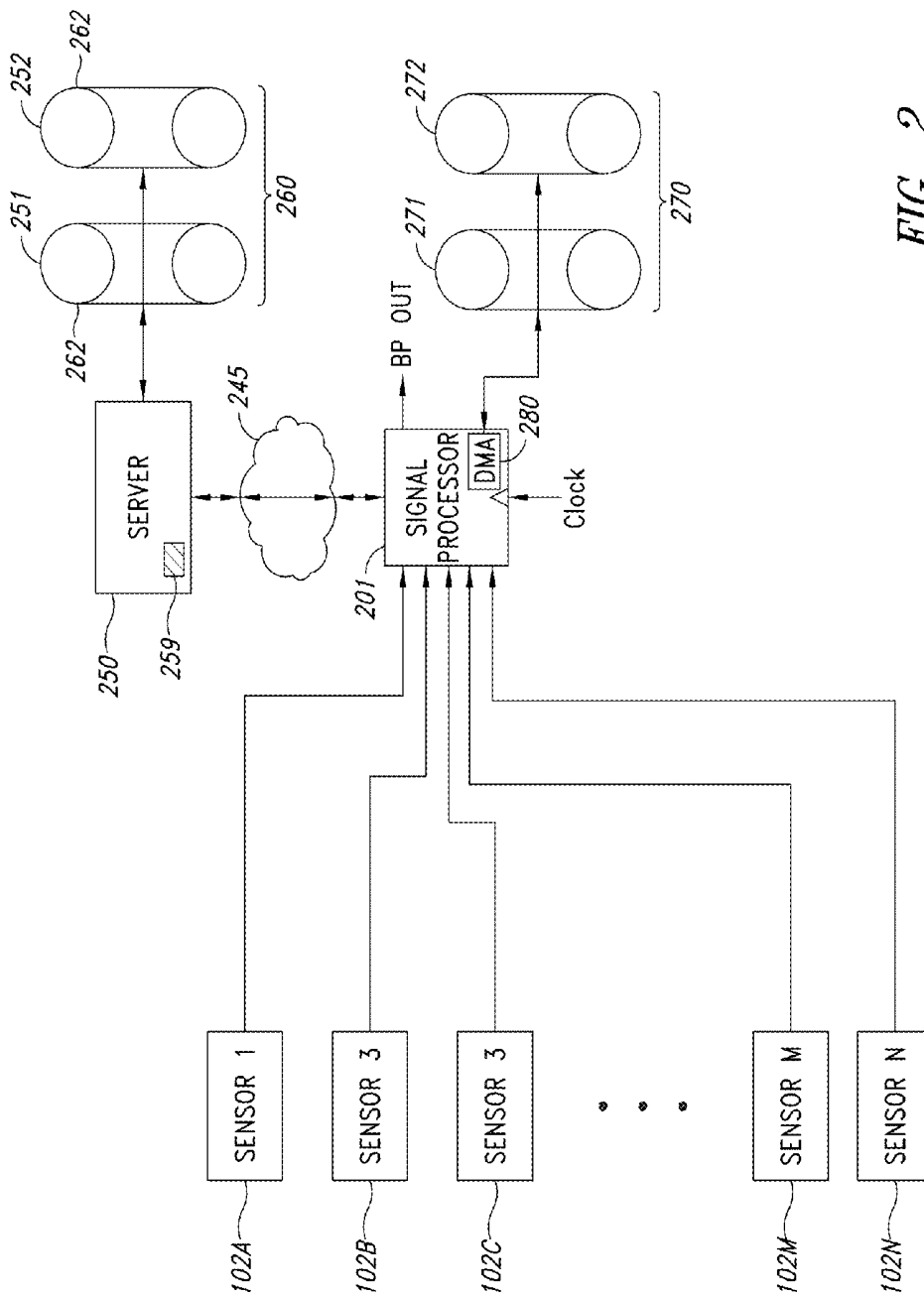


FIG. 2

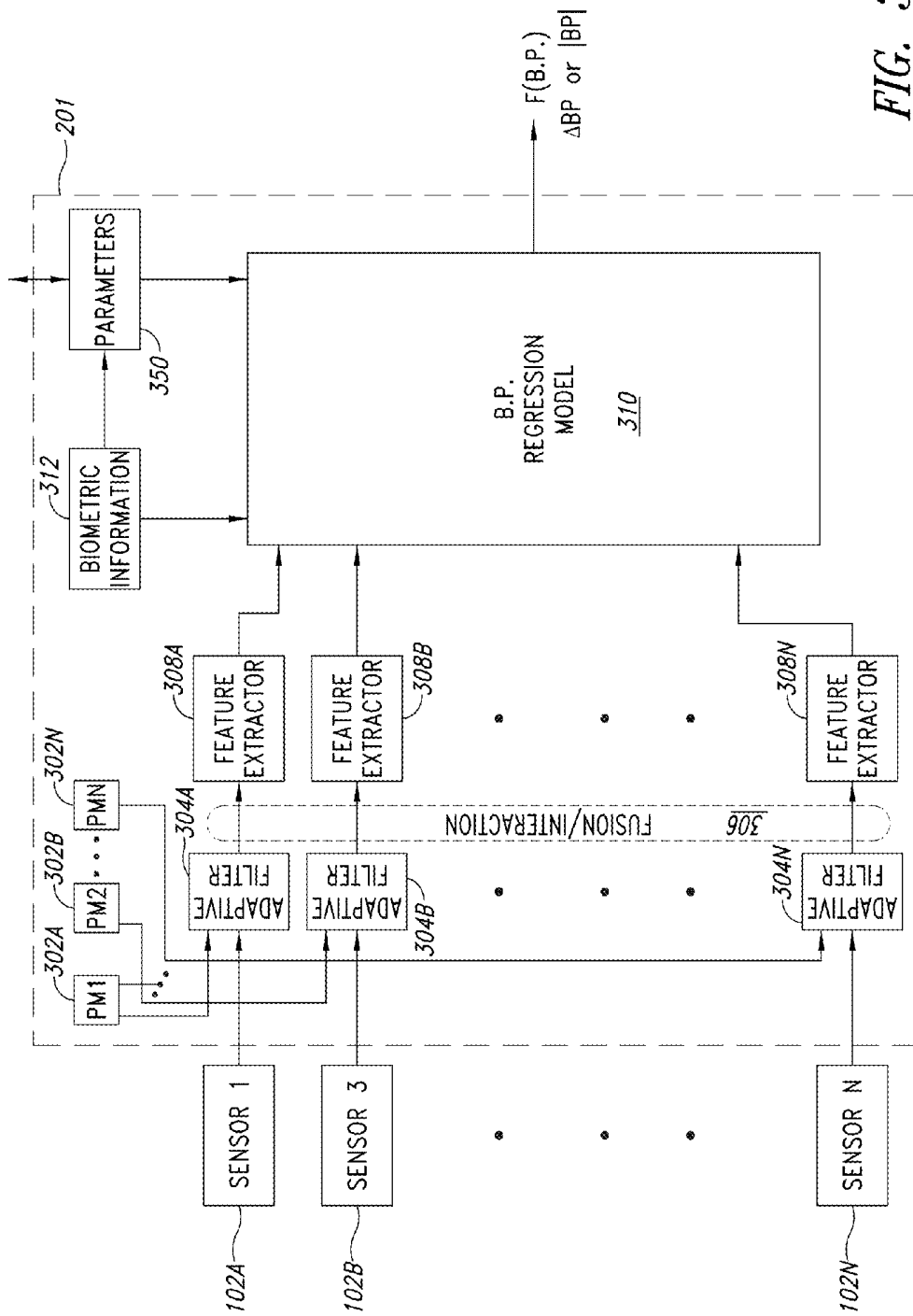


FIG. 3

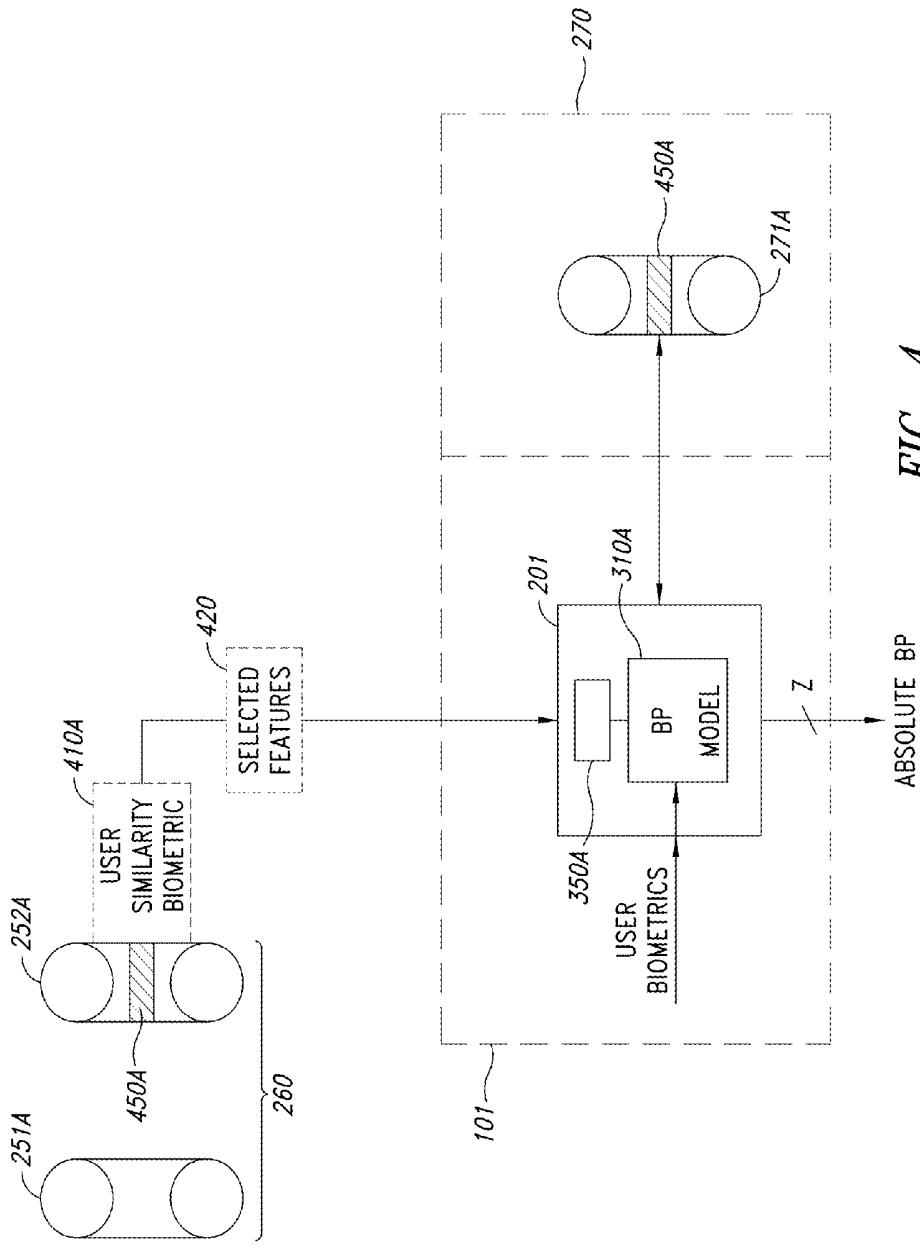


FIG. 4

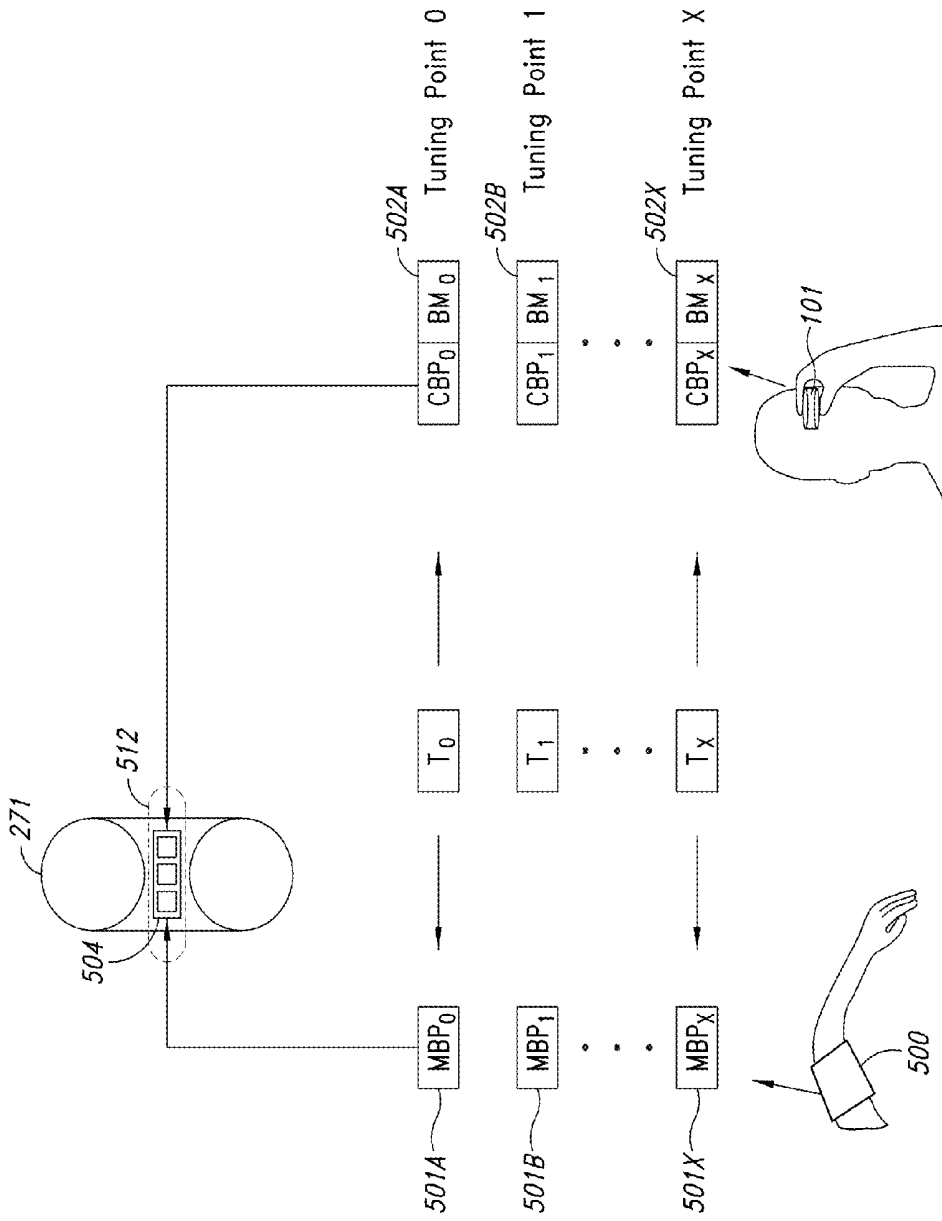


FIG. 5A

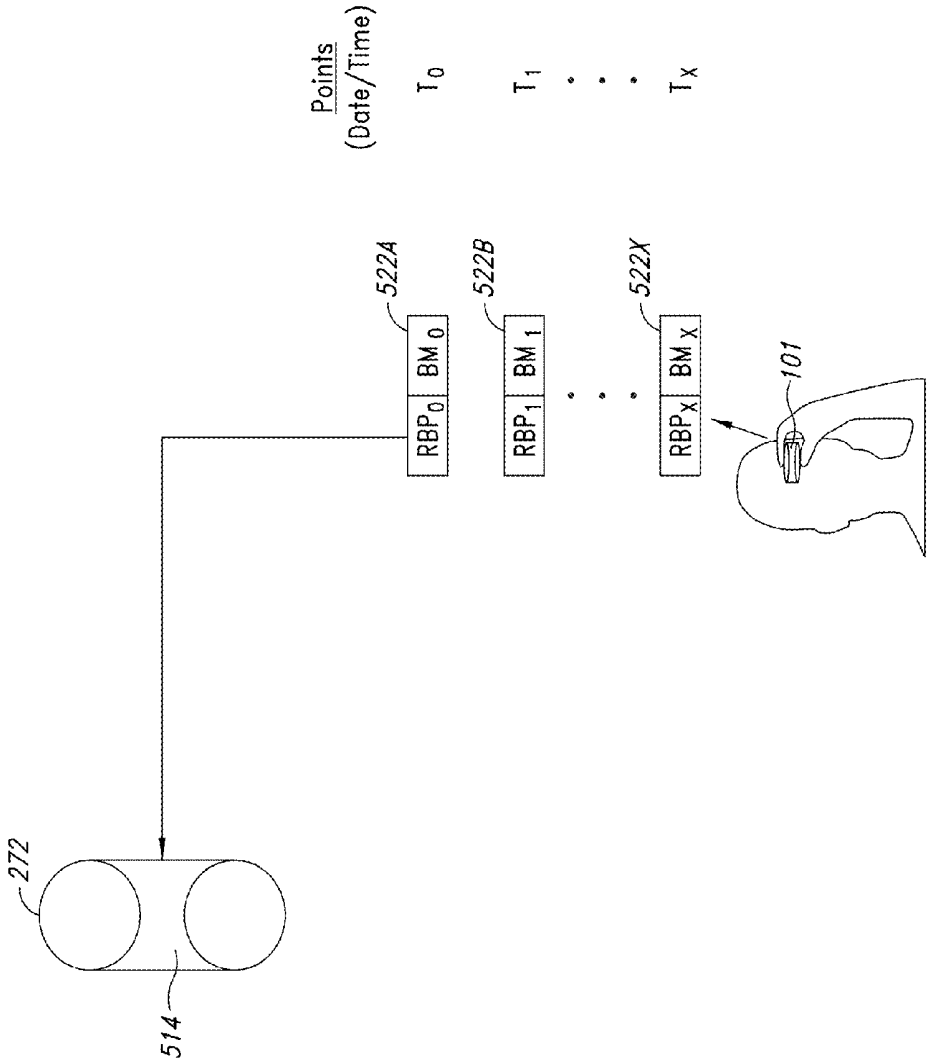


FIG. 5B

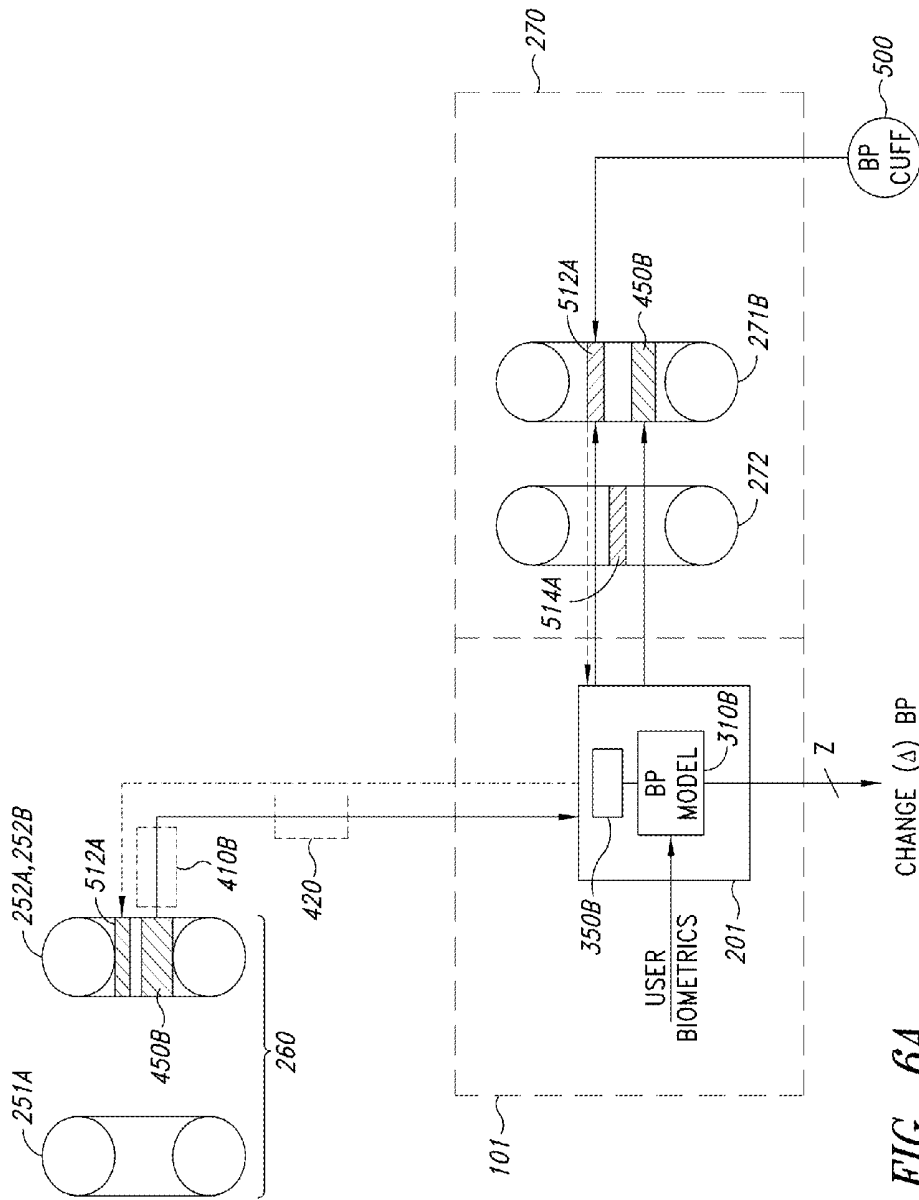


FIG. 6A

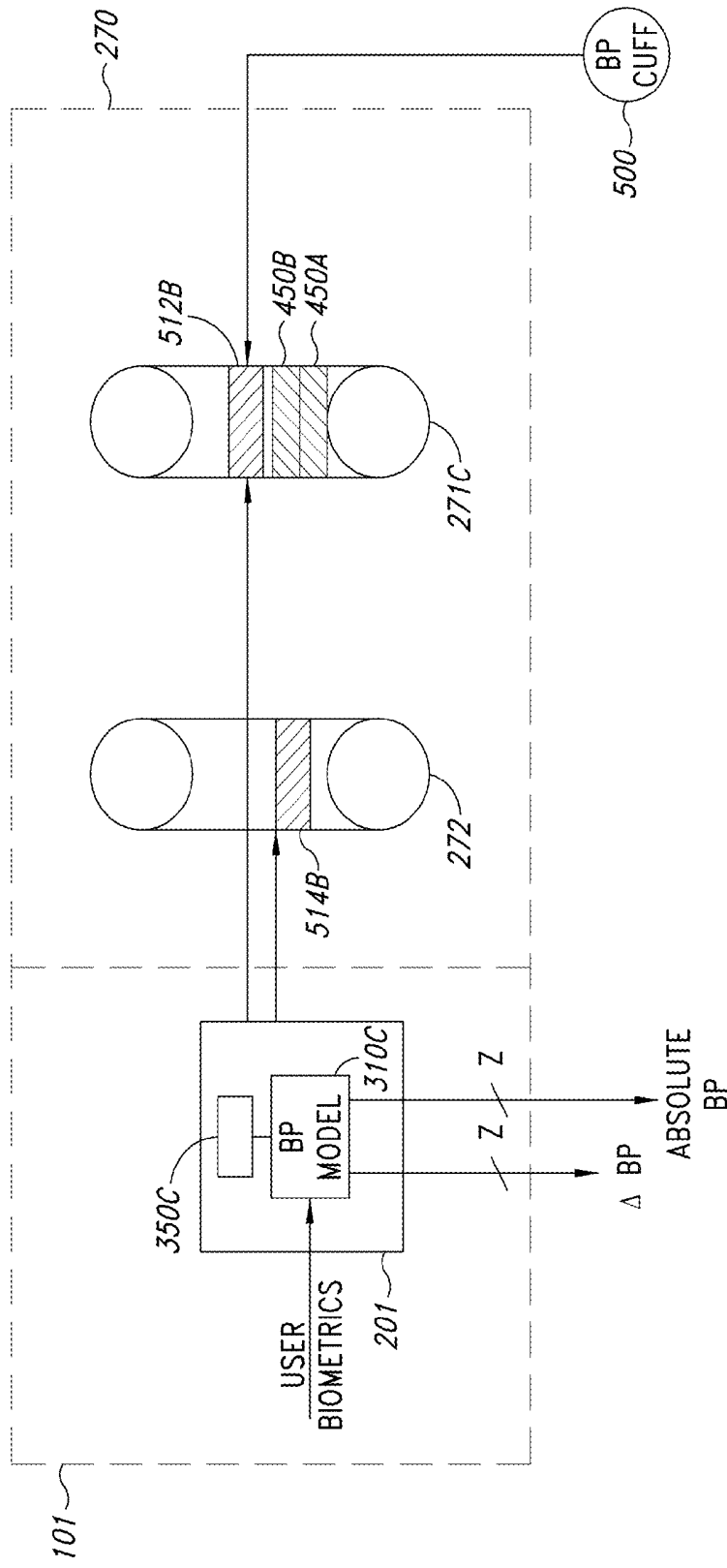


FIG. 6B

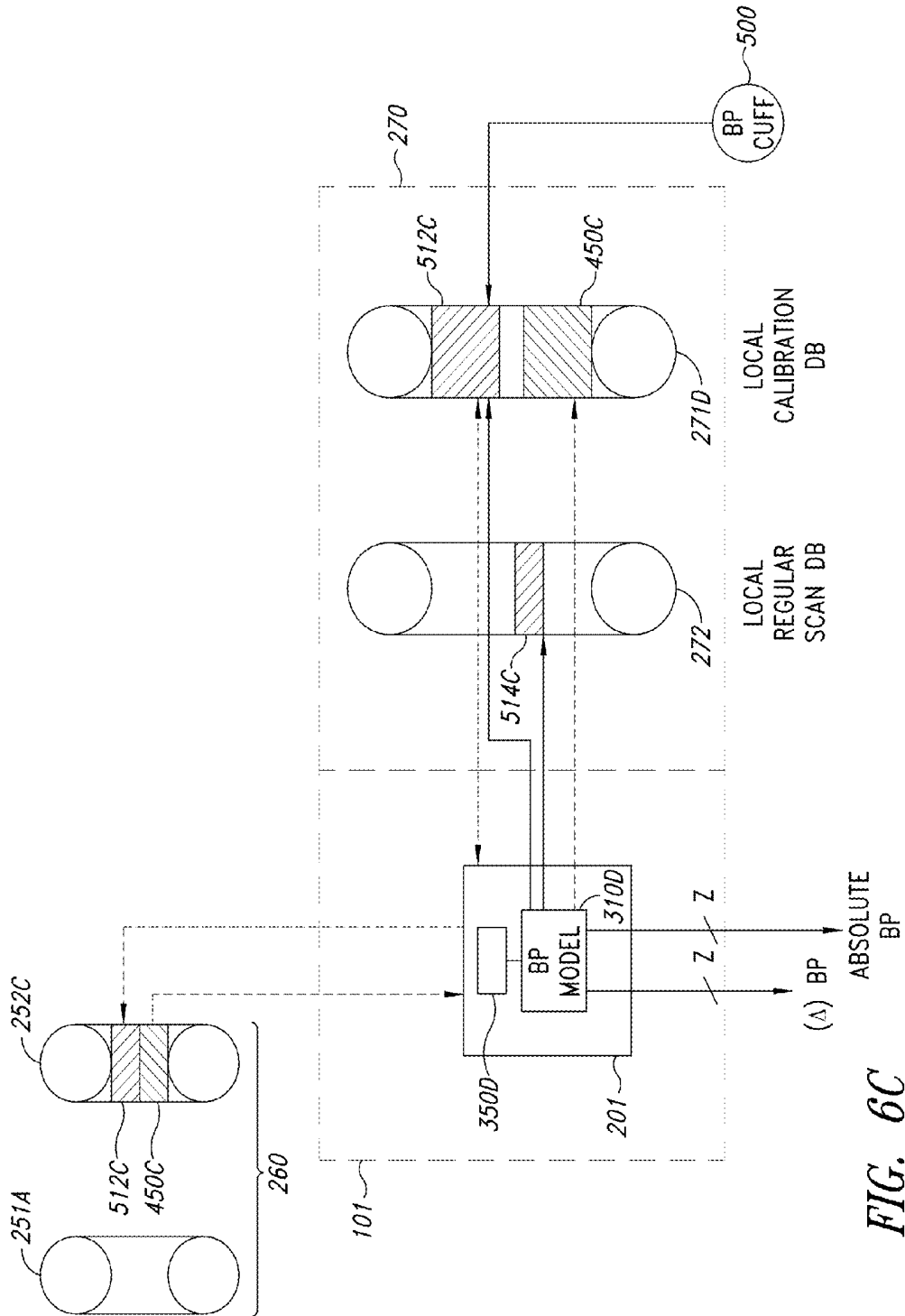


FIG. 6C

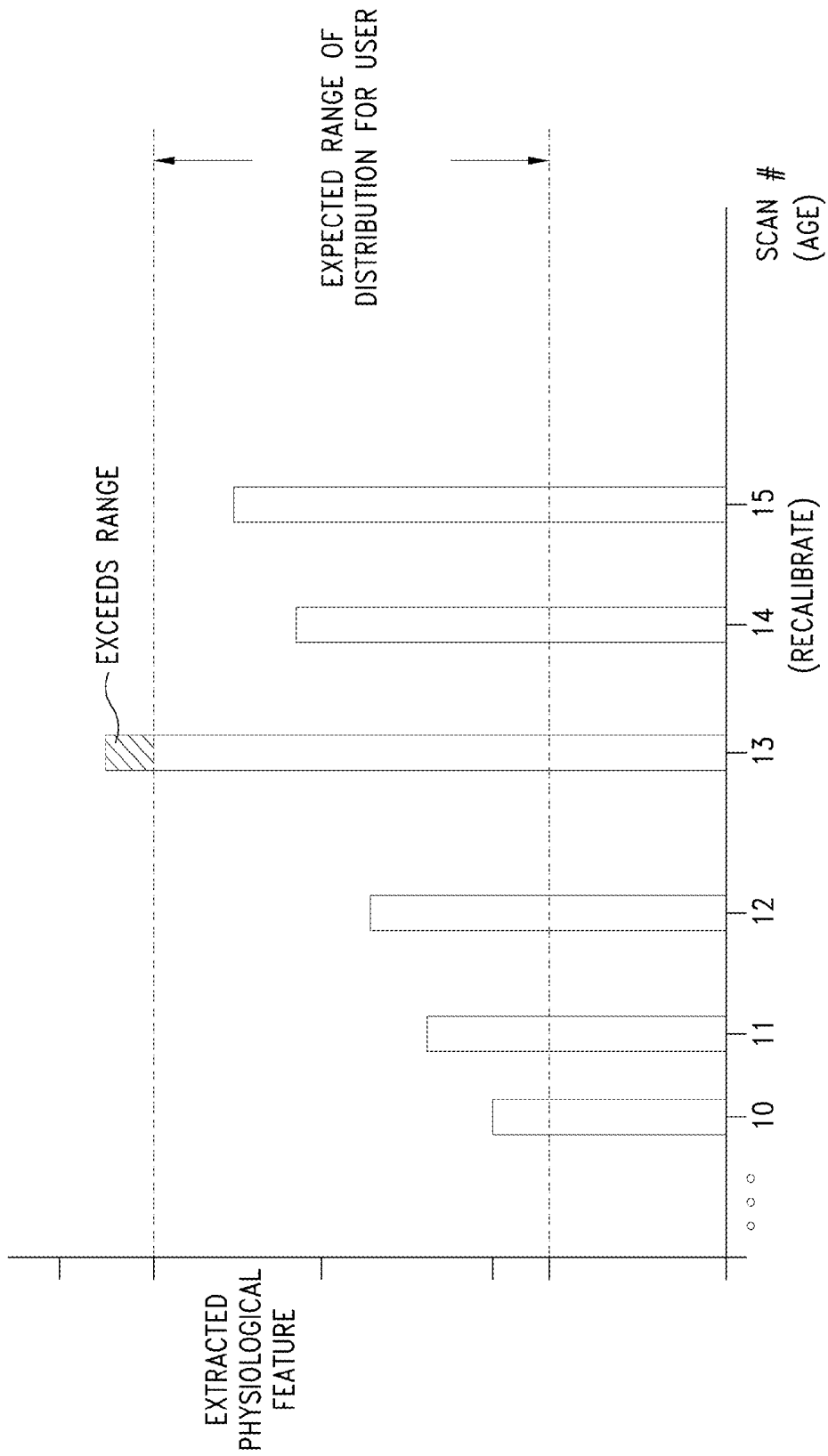


FIG. 7

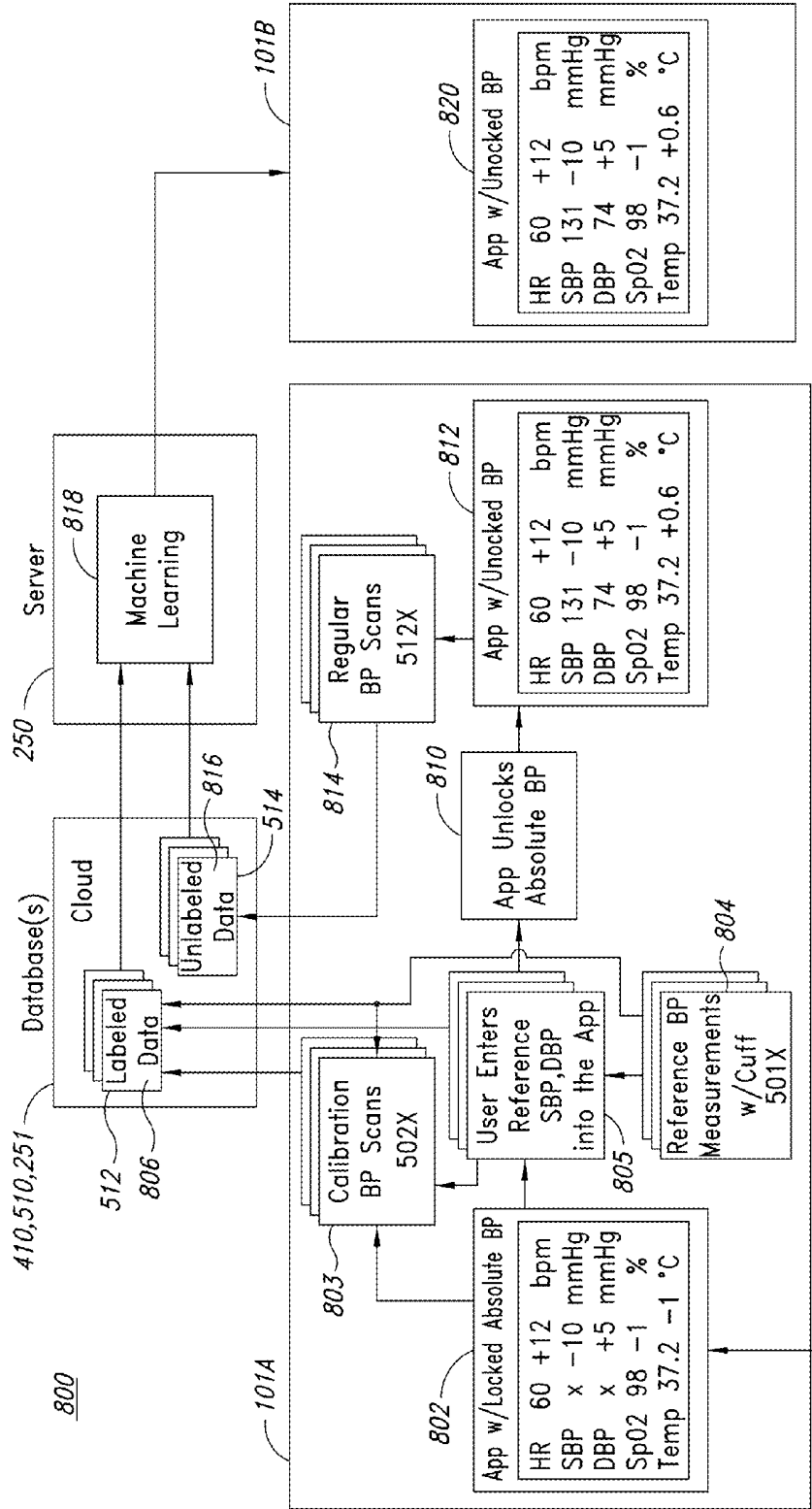


FIG. 8

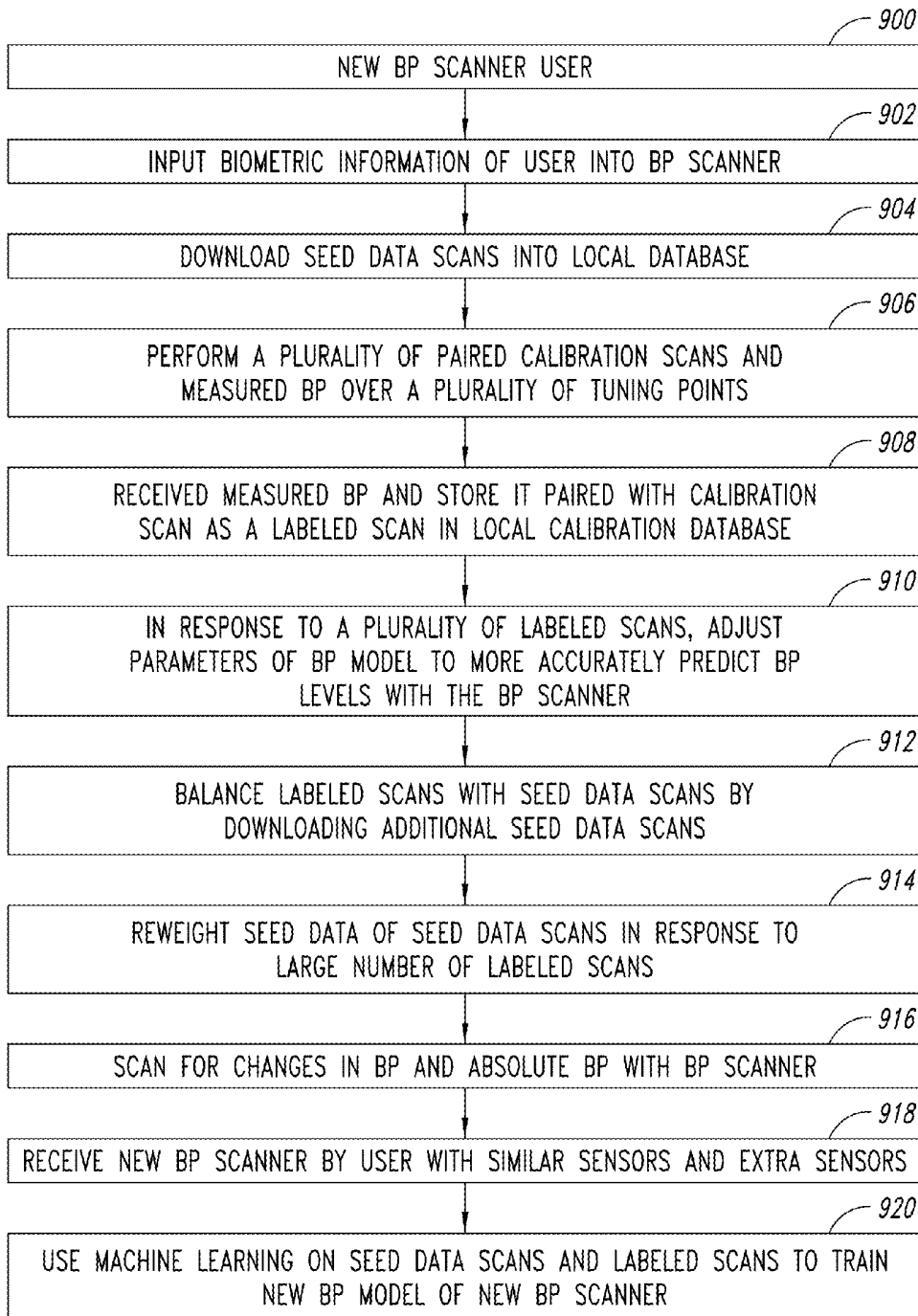


FIG. 9

**CUFF-LESS MULTI-SENSOR SYSTEM FOR
STATISTICAL INFERENCE OF BLOOD
PRESSURE WITH PROGRESSIVE
LEARNING/TUNING**

CROSS-REFERENCE TO RELATED
APPLICATIONS

[0001] This United States (U.S.) non-provisional patent application claims the benefit of U.S. Provisional Patent Application No. 62/306,626 filed on Mar. 10, 2016 by inventors Piotr Przybyszewski et al., titled CUFF-LESS MULTI-SENSOR SYSTEM FOR STATISTICAL INFERENCE OF BLOOD PRESSURE WITH PROGRESSIVE LEARNING/TUNING, incorporated herein by reference for all intents and purposes.

[0002] This United States (U.S.) patent application is related to U.S. patent application Ser. No. 14/641,303 filed on Mar. 6, 2015 by inventors Max Little, et al., entitled METHODS AND APPARATUS FOR SELF-CALIBRATING NON-INVASIVE CUFFLESS BLOOD PRESSURE MEASUREMENTS, incorporated herein by reference for all intents and purposes. This United States (U.S.) patent application is also related to U.S. patent application Ser. No. 14/704,961 filed on May 5, 2015 by inventors Bernard Burg, et al., entitled PORTABLE DEVICE WITH MULTIPLE INTEGRATED SENSORS FOR VITAL SIGNS SCANNING, incorporated herein by reference for all intents and purposes. This United States (U.S.) patent application is also related to U.S. patent application Ser. No. 14/292,820 filed on May 30, 2014 by inventors Wenyi Zhao, et al., entitled METHODS OF DATA ACQUISITION QUALITY AND DATA FUSION FOR PERSONAL PORTABLE WIRELESS VITAL SIGNS SCANNER, incorporated herein by reference for all intents and purposes.

FIELD

[0003] The embodiments of the invention relate generally to blood pressure (BP) measurement systems.

BACKGROUND

[0004] Blood pressure (systemic arterial blood pressure) is the pressure that circulating blood exerts against the walls of the blood vessels in the course of circulation, and is a good indication of the capacity of the blood vessels and of cardiac function in a body. Blood pressure may be measured in different ways and traditionally has units of millimeters of mercury (mmHg). Because arterial blood pressure varies as a waveform, referred to as an arterial pressure wave, measurements of interest are systolic blood pressure (SDP) (its peak) and diastole blood pressure (DBP) (its lowest point). Systolic blood pressure (SI)P) is the maximum arterial pressure during contraction of heart as it beats and pushes blood out. Diastolic blood pressure (DI)3P) refers to the lowest blood pressure within the arterial blood stream due to expansion of heart when pulling blood into the heart and it is not beating.

[0005] Blood pressure may be measured in various ways that may be characterized as invasive and non-invasive. One non-invasive technique of measuring blood pressure uses a sphygmomanometer, an inflatable cuff to collapse and then release the artery under the cuff in a controlled manner, and a pressure measurement device (e.g., manometer) to measure the pressure. The sphygmomanometer is sometimes

referred to as a blood pressure cuff. A sphygmomanometer can provide fairly accurate readings of blood pressure. However, the use of a sphygmomanometer is rather intrusive and not very user friendly so it may not be used that often by a user to capture his/her blood pressure. It is desirable to provide an accurate cuff-less based system and method for determining blood pressure.

BRIEF DESCRIPTIONS OF THE DRAWINGS

[0006] FIG. 1 is diagram of a cuff-less blood pressure measurement system coupled to a user body to non-invasively calculate blood pressure.

[0007] FIG. 2 is a functional block diagram of the cuff-less blood pressure measurement system.

[0008] FIG. 3 is a functional block diagram of signal processing performed by the signal processor to non-invasively calculate blood pressure.

[0009] FIG. 4 illustrates a functional block diagram of downloading seed BP data into the scanner from which parameters/coefficients are selected to non-invasively calculate a measure of blood pressure without using any reference measured blood pressure to tune them.

[0010] FIG. 5A illustrates tuning of the BP model by capturing one or more reference blood pressure measurements with a blood pressure cuff and pairing them with respective one or more reference blood pressure scans with a cuff-less blood pressure scanner at respective tuning points.

[0011] FIG. 5B illustrates taking one or more regular blood pressure scans with a cuff-less blood pressure scanner at respective scanning points (dates and times) without a paired reference blood pressure measurement with a blood pressure cuff.

[0012] FIGS. 6A-6C illustrate functional block diagrams of the BP scanner and databases, from which parameters/coefficients are selected to tune an adaptive BP model to non-invasively calculate a measure of blood pressure.

[0013] FIG. 7 illustrates an exemplar histogram of an extracted physiologic feature that may be made over each blood pressure scan to detect when the blood pressure model is out of tune.

[0014] FIG. 8 illustrates a flow chart of the BP model and the BP scanner being used to calculate absolute levels of BP.

[0015] FIG. 9 illustrates a flow chart of tuning the BP model and the BP scanner to a new user with reference scans and reference BP measurements.

DETAILED DESCRIPTION

[0016] In the following detailed description of the embodiments of the invention, numerous specific details are set forth in order to provide a thorough understanding of the present invention. However, it will be obvious to one skilled in the art that the embodiments of the invention may be practiced without these specific details. In other instances well known methods, procedures, components, and circuits have not been described in detail so as not to unnecessarily obscure aspects of the embodiments of the invention.

[0017] It is desirable to provide an accurate cuff-less based system and method for determining blood pressure. Cuff-less methods for determining blood pressure often rely on a pulse-wave-transit-time model (or on its related quantities, such as pulse-arrival-time, pulse-velocity, etc.). Such methods typically involve measurement of ECG and PPG or

multiple PPG signals from different sites of the body. By calculating the time it takes for a blood pressure pulse to travel between two points separated by a known distance within the cardio-vascular system, one can determine the average stiffness of vessels. This, in turn, can be used to estimate the systolic and diastolic blood pressures. However, these methods may require periodic calibration, because conversion coefficients often change over time and cannot be treated as a constant over long time periods. During calibrations of the conversion coefficients, recording of ECG and PPG or of multiple PPG signals is usually paired with a cuff-based measurement of blood pressure. Accordingly, there may be a number of disadvantages such as limited accuracy, requirement for relatively frequent re-calibrations, non-improvement of accuracy over time, and/or an inability to cover diverse range of physiological states. It is desirable to provide a cuff-less measurement system for the inference of blood pressure with periodic tuning, which overcomes one or more of these limitations.

Cuff-Less Blood Pressure Measurement System

[0018] Referring now to FIG. 1, a cuff-less blood pressure measurement system 100 is shown including a centralized portable BP scanner 101 and a plurality of bio-sensors 102A-102N. The plurality of bio-sensors 102A-102N are in communication with a signal processor (e.g., signal processor 201 of FIG. 2) of the centralized portable BP scanner 101. A plurality of bio-sensors 102A-102D are local to the signal processor within a housing of the centralized portable BP scanner 101. A plurality of bio-sensors 102H-102N can be positioned at different points or sites on the user body 199, remote from the signal processor of the centralized portable BP scanner 101. For example, the remote bio-sensors 102H,102M may be located on the left and right arms respectively. The remote bio-sensors 102J,102I may be located on the left and right thighs respectively. The remote bio-sensors 102K,102L may be located on the left and right thighs respectively. One or more remote bio-sensors 102N may be located over or around the chest and/or back.

[0019] One or more of the plurality of remote bio-sensors 102H-102N may be in wireless communication with the signal processor of the centralized portable BP scanner 101 by radio receiver/transmitters. Alternatively, one or more of the plurality of remote bio-sensors 102L-102N may be in wired communication with the signal processor of the centralized portable BP scanner 101 by wire cables.

[0020] The plurality of bio-sensors 102A-102N may be optical sensors, electrical sensors (or their electrodes), motion sensors, acceleration sensors, piezo-electric sensors, acoustic sensors, and/or combinations thereof. Some may include a stimulator induced upon the body of the user such as wavelengths of light or photons for example, from one or more LEDs or semiconductor lasers. The plurality of bio-sensors 102A-102N include an electrical electro-cardiogram (ECG) sensor, multiple optical photo-plethysmograph (PPG) sensors located at different positions upon the users body (multi-site), an electrical impedance plethysmograph (IPG) sensor, a piezo-electric BCG sensor, an accelerometer sensor, a pressure sensor, ultrasound imaging sensor, ultrasound Doppler sensor, laser Doppler sensor, far infra-red (IR) imaging sensor, specular imaging sensor, etc.

[0021] Referring now to FIG. 2, the plurality of bio-sensors 102A-102N are coupled in communication with the signal processor 201 of a BP scanner (or vital signs scanner)

101. A server 250 with one or more remote BP databases 260 is periodically coupled in communication with the signal processor 201 over one or more networks 245, such as the internet, wireless local area network, and/or Bluetooth network. The server 250 includes one or more processors 259 and one or more storage devices 262 to store the one or more BP databases 260, as well as applications and firmware. The applications support the databases, the signal processor 201, and the centralized portable BP scanner 101. The one or more remote BP databases 260 can store biometric information provided by users, physiological information of users captured by centralized portable BP scanners 101 and the plurality of bio-sensors 102A-102N during reference BP scans, and associated reference BP measurements of users. Initially, one of the one or more remote BP databases 260 store a seed BP database of seed BP data

[0022] The BP scanner 101 may include storage devices that store one or more local user BP databases 270 coupled in communication to the signal processor 201. Alternatively, the storage devices may be in a local computing device, such as a smart phone. The server may also allocate a portion of the capacity of a storage device to securely maintain the data of the one or more local user BP databases. Similar to the one or more remote BP databases 260, the one or more local BP databases 270 can store biometric information provided by the user, physiological information captured by the centralized portable BP scanner 101 and the plurality of bio-sensors 102A-102N during reference BP scans, and reference BP measurements of the user. The signal processor 280 may include a direct memory access (DMA) engine 280 to more quickly transfer blocks of data between the BP scanner 101, the one or more local BP databases 270, and the one or more remote BP databases 260.

[0023] The plurality of bio-sensors 102A-102N are energized by the signal processor 201 at the start of a BP scan. The corresponding signals sensed by each bio-sensor are measured simultaneously over the same time during the BP scan. The sensed signals from each bio-sensor are coupled into the signal processor 201 and synchronized in time by the same clock signal CLOCK. As its name suggests, the signal processor 201 processes the sensed signals from the plurality of bio-sensors 102A-102N.

[0024] In accordance with an adaptive BP model and its coefficients or parameters, the signal processor 201 generates a gauge, a prediction, or a statistical inference of blood pressure (diastolic and systolic) of the user in response to the sensed signals at the biosensors. The blood pressure values output by the signal processor 201 may be absolute values of blood pressure, relative change in blood pressure, or both absolute and relative change in blood pressure.

[0025] Referring now to FIG. 3, a functional block diagram of the signal processor 201 is shown coupled to the plurality of bio-sensors 102A-102N. The sensed signals from the bio-sensors 102A-10N are respectively coupled into a plurality of adaptive filters 304A-304N, such as a Kalman Filter (KF) or an Extended Kalman Filter (EKF). The plurality of adaptive filters 304A-304N are responsive to respective physiology-based models 302A-302N of what feature is being extracted and what is being captured. The sensed signals are processed by the adaptive filters 304A-304N with use of the respective underlying physiology-based models 302A-302N to detect desired signals.

[0026] Various physiological features are extracted from the processed signals by feature extractors 308A-308N. The

plurality of extractors **304A-304N** are programmed by the BP model to extract the desired physiological features for the BP model **310**. In this manner, if the BP model is updated to use additional physiological features, then the signal processor **201** is adaptable to the updated BP model. Exemplary physiological features that are extracted include quantities with direct physiological interpretations (e.g., pulse width transit (PWT) time, heart rate (HR), pulse rate (PR), duration of the systolic and diastolic phases, properties of P, Q, R, S, T segments of the ECG waveform, etc.), as well as mathematical features describing the signals (such as: magnitudes and phases of signal components after decomposition into Fourier series, correlation with principal components of the signals, signal histograms, auto- and cross-correlations, etc.). One or more of the processes signals may be fused together by fusing/interacting processes **306** to form other signals from which features are extracted. The collection of extracted features from the sensed signals may be referred to as a feature set.

[0027] The feature-set of extracted features is augmented with biometric information **312** provided by the user. Biometric features of the underlying user may be extracted from the biometric information **312** provided by the user over time. For example, a user may input his birth date as part of the biometric information **312**. For each BP scan, the user's current age may be extracted from the user's birth date in response to the current date of the BP scan from a calendar maintained by the signal processor **201**.

[0028] At the center of the cuff-less BP system, the signal processor **201** includes an underlying adaptive parametric BP model **310** that links the extracted signal features and extracted biometric features with blood pressure. The parametric BP model **310** receives coefficients/parameters **350** and generates a measure or a gauge of blood pressure $f(\text{B.P.})$ (a change in BP, or an absolute BP) in response to the extracted signal features and extracted biometric features. To obtain more accurate measures of blood pressure, the parametric BP model **310** is tuned over time with updated coefficients/parameters **350** as it is used by the user.

[0029] Referring now back to FIG. 2, prior to release of the BP scanner **101** to users, the manufacturer generates a prior seed BP database in the one or more databases **260** associated with an initial BP model in the scanner **101** for determining absolute blood pressure levels. Such as shown in FIG. 5A, a plurality of reference subjects each use a reference BP measuring device, such as a blood pressure cuff **500**, to determine measured reference BP (SBP and DBP) levels (reference BP measurements) while at the same time using the BP scanner **101** to perform a reference BP scan to determine an inference or estimate of their blood pressure. The reference subjects may be selected to provide a wide range of biometric information for the measured reference BP and the reference BP scan. A large number of reference subjects performing paired reference BP scans and reference BP measurements in a seed BP database is useful in determining absolute blood pressure values for a wide range of users of the BP scanner.

[0030] A plurality of reference BP measurements and reference BP scans may be performed on each subject during different times of the day. Over a period of time, a subset of the reference subjects perform a large number of paired reference BP scans and reference BP measurements. The large number of paired reference data per subject in a seed BP database is useful in determining calculated changes in

blood pressure values from scan to scan during different times of the day for users of the BP scanner.

[0031] As shown in FIG. 2, for each reference BP scan and reference BP measurement, one of the prior seed BP databases **251** stores the raw signals from the plurality of bio-sensors **102A-102N**, the measured reference BP levels, and biometric information of the subject for each entry of paired reference data. Another prior seed BP database **252** stores the physiological signal features extracted from the sensor signals by the extractors, the measured reference BP levels, and biometric information of the subject for each entry. The portion of the data in the seed BP database **252** that is downloaded into a BP scanner may generally be referred to herein as seed BP data or simply seed data. While biometric information about the plurality of subjects is available in the databases, the identity of the plurality of subjects is not. Anonymous subject identification (ID) (e.g., a numeric ID or an alpha-numeric ID) is used for each database entry so that the subjects remain anonymous in the one or more seed BP databases to all users.

[0032] The data for machine learning of parameters/coefficients to tune a BP model for statistical inference of blood pressure levels of a user are now described in more detail.

Parameter Determination for Blood Pressure Model

[0033] Referring now to FIGS. 4, 5A-5B, and 6A-6C, the coefficients (parameters) **350** of the BP regression model **310** are determined via machine learning techniques (such as: Linear Regression, Polynomial Regression, Support Vector Machine, Random Forrest, Neural Networks, etc.). The machine learning is performed progressively over several phases generating an evolving BP model **310** with increasing accuracy.

[0034] With reference to FIG. 4, coefficients (parameters **350A**) for the first initial BP model **310A** are derived from a large remote seed BP database **252A** of BP scans paired with blood pressure levels measured using a reference device. The seed BP database **252A** includes a large number of subjects with diverse levels of blood pressures and diverse biometrics. At this point, there is no calibration or tuning of the parameters of the BP model **310A** and its regression algorithm to the user's measured blood pressure levels of diastolic and systolic blood pressure. Accordingly, the initial BP model **310A** has the capability to infer the user's blood pressure with limited accuracy.

[0035] The seed BP database **252A** includes data from a large number of human subjects (a function of model complexity—generally at least ten times the number of parameters or variables, e.g., greater than 100) with diverse levels of blood pressures and diverse biometrics (e.g., age, sex, weight, height, body-mass-index (BMI), smoking, non-smoking, waist circumference, etc.). A subset of the seed BP database **252A**, referred to as seed BP data **450A** from seed scans, is used to for selecting and updating or tuning the parameters **350A** and the BP model to the user. The seed BP data **450A** is selected from the seed BP database **252A** based on similarities with the user.

[0036] Initially, similar biometrics (e.g., age, sex, weight, height, body-mass-index (BMI), smoking, non-smoking, waist circumference, etc.) are used to select the seed BP data **450A**. As reference blood pressure measurements are taken of the user, similar systolic and diastolic blood pressures (or user's distribution of the reference blood pressure from the tuning points) may also be used to refine the seed BP data

for tuning the parameters of the BP model to the user. As more user information is gathered by the BP scanner **101** during BP scans, similar extracted signal features (e.g., user's distribution of signal features from all scans) may also be used to refine the seed BP data for tuning the parameters of the BP model to the user. Accordingly, a filter **410A** with various user information may be used to search the seed BP database **252A** for seed BP data to initialize and tune the parameters **350** of the BP model **310**.

[0037] Furthermore, not all the extracted signal features may be needed to tune the parameters and model. A relevant subset of extracted signal features from the seed BP database may be used to tune the parameters **350** of the BP model **310**. Accordingly, a second filter **420** with the relevant signal features that are desired may be used to limit the amount of seed BP data that is download from the seed BP database **252A** to tune the parameters **350** of the BP model **310**. This can save download time and reduce storage capacity usage in the local storage device used to store the seed BP data **450A**. If sufficient storage is available in the local reference BP database **271A**, the second filter **420** may not be needed and all the extracted signal features in the similar seed BP data may be downloaded and stored.

[0038] Occasionally, the manufacturer of the BP scanner **101** may update the seed BP database with significant changes. The BP scanner **101** may recognize the significant change and download the updates on its own. Alternatively, the manufacturer of the BP scanner **101** can push out the update in the seed BP database to all users and force an update of the seed BP data **450A** used by the BP scanner. The BP model in the BP scanner **101** may be updated by software or firmware updates. The update to the BP model may require users to re-download the seed BP data **450A** used by their BP scanner.

[0039] The initial BP model **310A** and coefficients (parameters) **350A** derived from the seed BP data **450A** can infer the absolute values of a user's blood pressure from each BP scan with the plurality of sensors. While the absolute values of the user's blood pressure may be accurate for a general health scanner, absolute values of the user's blood pressure may not be sufficiently accurate for a medical BP scanner or a medical vital signs scanner without further tuning.

[0040] Referring now to FIG. **5A**, additional phases of parameterization for the blood pressure model involve periodically tuning the parameters of the BP model with one or more blood pressure measurements (reference measured blood pressure, MBP0 **501A** through MBPX **501X**, generally referred to with MBPX **501X**) captured with a blood pressure cuff **502** or other accurate means of BP measurement. The one or more reference blood pressure measurements MBP0 **501A** through MBPX **501X** are paired with respective one or more reference blood pressure scans (reference BP scans of reference scanned signal features, CBP0 **502A** through CPBx **502X**, generally referred to by CPBx **502X**) that are taken with the cuff-less blood pressure scanner **101** at respective tuning points **T0** through **TX**.

[0041] Each of the reference blood pressure measurements MBPX **501X** are levels of SBP and DBP captured with the blood pressure cuff **502** or other accurate means of BP measurement. Each of the reference scanned signal features CPBx **502X** includes the calculated or inferred SBP and DBP (or their calculated changes) and extracted signal features from the signals sensed by the bio-sensors. The biometric data **BM0** through **BMx** (generally referred to as

BMx) of the user is included with each of the reference BP scans CPBx **502X**. The biometric data **BMx** of the user is expected to either stay constant (e.g. sex, height) or change slowly over time, such as over several months or years. The blood pressure measurements and the scanned or calculated blood pressure values are expected to change over time of day as well as on a daily basis from scan to scan. The blood pressure measurements and the scanned or calculated blood pressure values may also have long-term trends as the user ages. The extracted signal features in each BP scan are also expected to vary from scan to scan. Accordingly, the biometric data **BMx** of the user will seem to be relatively constant in comparison with the daily variations in the blood pressure values and the extracted signal features.

[0042] The paired reference measured blood pressure MBPX and reference scanned signal features CBPX are stored together along with the biometric data **BMx** at each tuning point (date/time stamp) as paired reference data **504** into a local reference database **271**. Each of the paired reference data of the measured blood pressure MBPX and reference scanned signal features CBPX including biometric data associated with the user are stored with the tuning point (date/time stamp) in the local reference database **271** as user labeled BP data **512**. That is, the local reference **271** database stores entries of user labeled data **512** with date/time stamp, biometric information, extracted signal features, and measured blood pressure (SBP and DBP).

[0043] The user labeled BP data **512** stored in the local reference database **271** may be periodically uploaded to the seed BP database maintained by the server **250**. This expands the seed BP database over time with more seed BP data and possibly a wider range of biometrics being associated with the added BP data. The seed BP database similarly stores entries of seed labeled BP data **450** from the anonymous subjects with date/time stamp, biometric information, extracted signal features, and measured blood pressure (SBP and DBP) but further includes a unique anonymous subject identifier (subject ID) tagged to it.

[0044] A new user may elect to become an anonymous subject of the seed BP database by anonymously contributing his/her user labeled BP data **512** to the seed BP database going forward. If so, the user is assigned a unique anonymous subject identifier (subject ID). Periodically, when the BP scanner **101** is in communication with the server **250**, the user labeled BP data **512** may be tagged with the subject ID and uploaded to the seed BP database as seed BP data. The subject ID facilitates counting the quantity of seed BP data (e.g., the number of paired reference data) contributed by a subject to the seed BP database. The ratio of quantity of seed BP data per subject may be used as one filter factor in downloading seed BP data from the seed BP database.

[0045] Referring now to FIG. **5B**, other BP scans may be made with the cuff-less blood pressure scanner **101** at a variety of dates/times **t1-tx** but unassociated with any reference measured blood pressure. These unpaired BP scans may be referred to as regular BP scans **522A-522X** and stored in the local regular scan database **272** as user unlabeled BP data **514**. Each entry of a plurality of user unlabeled BP data **514** includes a date/time stamp, biometric information, extracted signal features, and inferred blood pressure values (SBP and DBP). Without a paired reference measured blood pressure, the extracted signal features in the regular BP scans **522A-522X** are not critical to machine learning and tuning of the BP model. However, the paired

reference data of the user labeled BP data **512** stored in the local reference database **271** may be used to tune the BP model.

[0046] Referring now to FIG. 6A, coefficients (parameters **350B**) for the second initial BP model **310B** are also derived from the large seed BP database **252A**. The BP model **310B** does not determine absolute blood pressure levels. Instead, the BP model **310B** infers the relative blood pressure changes (Δ BP including Δ SBP and Δ DBP) from the last scan. The relative blood pressure changes inferred by the BP model **310B** are more reliable and accurate than the absolute blood pressure values inferred by the BP model **310A** and its parameters **350A**. The second initial BP model **310B** utilizes the same seed BP database **252A**. However, the downloading of seed BP data **450B** from the seed BP data is more selective with a filter **410B**. The selected seed BP data **450B** that is downloaded with the search filter **410B** is from subjects similar to the user, like filter **410A**, but with subjects that also have a large number (e.g., greater than 10) of paired reference data stored as seed labeled data in the seed BP database. That is, the seed BP data **450B** that is selected for downloading has a scan frequency ratio of scans per subject greater than a predetermined number (e.g., 10). The subject ID is used to determine the ratio in the seed BP database for each subject. This seed BP data **450B** with a greater scan frequency ratio better supports tuning of the BP model **310B** to calculate and infer a change in blood pressure values from one scan to the next.

[0047] To support the BP model **310B**, the local reference database **271B** may also include a number of user labeled data **512A** (paired reference data of extracted signal features with measured blood pressure values). The quantity of user labeled data **512A** for a new user is initially limited to just a few because he/she has not yet had a chance to perform many reference scans and reference measurements to generate user labeled data. Over time, it is expected the quantity of user labeled data becomes more in balance with the quantity of seed labeled data downloaded from the seed BP database.

[0048] With the limited number of user labeled scan data **512A** and the downloaded seed BP data **450B** stored in the local reference database **271B**, the BP model **310B** and its parameters **350B** can be tuned in response thereto to better estimate changes in user's blood pressure from one scan to the next. Combing the calculated change in BP from the BP scan with a recent blood pressure measurement with a blood pressure cuff, a reasonable prediction of blood pressure may be made from a BP scan with the BP scanner without using the blood pressure cuff.

[0049] Referring now to FIGS. 6B and 5A, a new BP model **310C** with initial coefficients (parameters) **350C** may be downloaded from the server into the BP scanner **201**. The new BP model **310C** combines the prior models **310A**, **310B** together as one to improve upon accuracy in calculations of the inferences in absolute blood pressure levels (SBP, DBP) and changes Δ BP in blood pressure levels (Δ SBP and Δ DBP).

[0050] At each tuning point T0 through TX in FIG. 5A, when the user performs a BP scan with a scan device **101** and measures blood pressure with a reference BP measuring device, such as a the blood pressure cuff **500**, new user-specific information becomes available. A single tuning point (e.g., T0), if used alone, is insufficient to adjust either BP model for inference of absolute blood pressure with

much better accuracy. However, when paired (assuming an adequate balance) with prior BP models **310A**, **310B** and downloaded seed BP data, such as the seed BP data **450A** and seed BP data **450B** from the seed BP database **252A**; and the expanded user labeled data **512B** stored in the local reference database **271C**; the new BP model **310C** with its tuned coefficients (parameters) **350C** becomes more accurate.

[0051] Moreover, the additional measured reference blood pressure MBPx and associated biometric information BMx captured by the user as user labeled data **512B** may be used to adequately re-weight samples in the seed BP data **450A** in the formation of parameters (coefficients) **350** for the BP model **310C** according to their similarity to the expanded user labeled data **512B**. In this manner, the prior absolute BP model **310A** may also be adjusted with new parameters, better tuned to the user measured referenced blood pressure MBPx, which further increases accuracy of BP inference of the overall BP model **310C**.

[0052] Referring now to FIGS. 6C and 5A, the seed BP databases and the local databases are not static but evolving. The local reference database evolves as more user paired reference data is captured from the reference blood pressure measurements MBPx and scanned features CBPx; associated together with the user as labeled user data **512C** and stored in the local reference database **271D**. As more users elect to become anonymous subjects of the seed BP database, the seed BP database evolves as their user labeled data **512C** is periodically uploaded to the seed BP database **252C** as an anonymous contribution, such as when the BP scanner **101** is in communication with the server **250**.

[0053] With every additional tuning point of the BP scanner **101** to the user, more user-specific information becomes available. The additional user labeled data is added (with adequate weights) to the initial dataset of user labeled data (e.g., **512A**, **512B**) to become a larger set of user labeled data **512C**. The larger set of user labeled data **512C** can be used to improve the BP model and its calculation of absolute blood pressure levels. The BP model **310D** is further tuned by coefficients (parameters **350D**) as time goes on with the additional data (e.g., from additional tuning with additional reference BP scans and additional reference BP measurements) in the set of user labeled data **512C**, providing further accuracy improvements.

[0054] It is desirable to balance the amount of expanded user labeled data **512C** with an expanded amount of seed BP data from the seed BP database **252C**. Additional seed BP data may be downloaded from the seed BP database **252C** to the local reference database **271D** as seed BP data **450B**. As time goes on the user may age such that the users biometric information may change. The filters **4410A**, **410B** used to search the seed BP data base can adapt to the change in biometric information to pull more relevant seed BP data from the seed BP data base. The additional seed BP data may be filtered to the updated biometric information of the user.

[0055] In order to provide a relatively good accuracy level at the early stage of usage by a new user, the BP scanner and its BP model may be tuned several times during the first day (or the first few days). After this initial period, additional tunings may be performed by the new user at a rate from once per three days to once per week. Determinations may be automatically made if the BP scanner and its BP model is out of tune and in need of new tuning points. After

performing a sufficient number of tunings, the system learns enough about the new user such that further tuning points may not be necessary.

Tuning Process

[0056] FIG. 9 illustrates a flow chart of a new user tuning process 900 of a BP application executed by the signal processor 201, processor 259 of the server 250, or other processor of a computing device. The tuning process 900 customizes the parameters of the BP model to each user and may be referred to as a parameter tuning process. The tuning process 900 of the BP application begins with the login of a new BP scanner user and goes to process 902.

[0057] At process 902, biometric information of the new user is entered and read by the BP scanner.

[0058] At process 904, seed BP data from seed scans of anonymous users is downloaded from the remote BP databases into the local database of the BP scanner.

[0059] At process 906, a plurality of paired reference scans and measured reference BP measurements are made over a plurality of tuning points. The levels of SBP and DBP of the measured reference BP measurements may be manually input into the local database through a user interface. Alternatively, with a BP cuff in communication with the BP scanner, the levels of SBP and DBP of the measured reference BP measurements may be automatically coupled to the BP scanner and loaded into the local database.

[0060] At process 908, the measured reference BP is received by the BP scanner and stored in a paired format with the reference BP scan. The paired data is stored as a labeled scan in the local reference database.

[0061] At process 910, in response to the plurality of labeled or reference scans, the parameters of the BP model may be updated to more accurately predict BP levels with the BP scanner.

[0062] At process 912, the number of labeled (user BP) scans of the user are balanced with the number of seed data scans from the seed subjects. Additional seed BP data associated with seed data scans may be downloaded to balance out the numbers.

[0063] At process 914, seed BP data of the seed data scans are reweighted in response to a large number of labeled scans.

[0064] At process 916, BP scans are performed by the BP scanner to predict or infer values for change in blood pressure and values of the absolute blood pressure for a user.

[0065] At process 918, a new BP scanner is received by the same user. The new BP scanner has similar sensors to the prior BP scanner. The new BP scanner can also have additional sensors over that of the prior BP scanner. The prior scan data captured with the prior BP scanner of a user can be used to train the new BP scanner to the same user.

[0066] At process 920, machine learning is used on the saved seed data scans and the labeled user scans to train the new BP model of the new BP scanner.

BP Calculation Process

[0067] FIG. 8 illustrates a flow chart of a BP calculation process 800 of a BP application (app) executed by the signal processor 201. The BP calculation process 800 adapts as the parameters of the BP model are tuned to the user. The process 800 may interface with the server 250 and its associated one or more BP databases. The server 250 and its

one or more processors 259 may execute a machine learning process 818 of a software application to tune the BP model of a new BP scanner to the same user with less effort.

[0068] At process 801, an initial BP measurement may be made with a blood pressure cuff or other more accurate means of determining systolic blood pressure (SDB) and diastolic blood pressure (DBP).

[0069] At process 802, the initial BP measurement may be input into the BP application and locked as the initial absolute BP for the BP scanner 101. If the initial BP measurement is not loaded, the SBP and DBP values are not shown by the scanner until sufficient reference BP scans 502X and reference BP measurements 501X are paired together and stored in the database to allow the BP model to determine a measure of absolute SBP and DPB levels.

[0070] At processes 803 and 804, one or more reference BP scans 502X may be made while concurrently taking one or more respective reference BP measurements 501X with a blood pressure cuff at one or more tuning points.

[0071] At process 805, the one or more respective reference BP measurements 501X may be manually or automatically entered into the BP application.

[0072] At process 806, the one or more reference BP scans 502X are paired with the one or more respective reference BP measurements 501X with the blood pressure cuff and stored into the BP database 251,510 as labeled user BP data 512.

[0073] While the absolute BP is locked by the BP application, the BP scanner 101 may determine changes in the absolute BP and show those changes to the user.

[0074] At process 810, after a number of pairings of a plurality of reference BP scans 502X and a plurality of respective reference BP measurements 501X taken at different times and possibly different dates, the BP application unlocks the absolute BP stored by the BP application and scanner. This provides a state of the BP application with an unlocked BP 812. In this state, the BP model is well tuned so that it may perform regular BP scans and calculate absolute BP.

[0075] At process 814, in the unlocked BP state 812, the BP application can perform one or more regular BP scans 512X to determine absolute DBP levels and absolute SBP levels that are worth saving into the global seed BP database. The regular BP scans 512X may be monitored for quality and detection of an out of tune condition as further described herein.

[0076] At process 816, with the BP model fairly well calibrated, the regular BP scans 512X stored in the local regular database of the BP scanner 101A may be periodically uploaded into a global database as unlabeled data 514 to make the global seed BP database larger.

[0077] At process 818, a machine learning process may be performed over the unlabeled data 514 in response to the labeled user data 512 to calibrate/tune the parameters/coefficients of a new BP model for a new BP scanner 101B.

[0078] The BP scanner device 101B may have a second set of a plurality of sensors greater in number than the number of sensors used by the scan device 101A to generate additional physiologic features to calculate blood pressure. The additional sensors can provide additional signals that may be fused together to improve accuracy of the BP model. Regardless, the prior sensor data and the prior reference scans in the database associated with the prior BP scanner 101A can be used to generate the parameters/coefficients for

the new BP scanner **101B** to more accurately calculate absolute BP, in a state of the BP application with an unlocked BP **820**. This avoids the same user from having to retrain the new scanner **101B** with a lot of new reference scans.

Automated Out of Tuning Detection

[0079] Referring now to FIG. 7, histograms for each extracted physiologic feature may be made over each blood pressure scan to detect when the blood pressure model is out of tune. In order to properly support automatic detection of need for a new tuning, historical information on feature distributions (histograms) during past tuning points as well as the histograms for all other scans can be formed. For each new scan, the relevant extracted features can be compared with the histograms. An expected range of distribution of each extracted physiologic feature may be formed for the user.

[0080] If a new scan extracts features that are outside of the expected range (rise above a maximum or fall below a minimum), the extracted feature may be suspect as well as the overall scan. If the extracted feature falls outside of the distribution (referred to as an extrapolation state), a new tuning point may be sought and suggested to the user in order to adjust the BP model back into a tuned state.

[0081] If the extracted feature is within the distribution of the histogram, corresponding to past tuning points, the new scan can be considered sufficiently similar to the training data. This provides a high degree of confidence in the inference of the new blood pressure levels being made by the scan. If the extracted feature falls within the distribution, the system is referred to being in an interpolation state.

Advantages

[0082] There are a number of advantages to the blood pressure model and the tuning of its coefficients/parameters by machine learning. The accuracy of the inference of the blood pressure values from the model can improve with subsequent tunings. The blood pressure model is flexible and can be customized to the user to provide better accuracy. With a history of extract features, the relevant features can be monitored to determine if the blood pressure model is out of tune and is desirable to re-tune with a new tuning. After a sufficient number of tunings, the system learns enough about the user, so that accurate inferences of blood pressure may be given without further tuning

CONCLUSION

[0083] Various specific materials, designs, dimensions, etc. are provided and are considered highly beneficial embodiments of the present disclosure in one regard. However, in other regard, such specifics are also merely illustrative of broader aspects of the present disclosure and should not be considered to necessarily limit to such broader aspects unless expressly specified to be required. In particular, the various specific dimensions provided as such examples are intended to be about any particular values provided, with typical tolerances and ranges of suitable alternatives as would be apparent to one of ordinary skill. Where particular combinations of such dimensions are provided for exemplary illustration of certain embodiments, the relative relationships between them are also contemplated as having been herein disclosed as additional beneficial aspects

(even if the specific values of the relative dimensions change). For example, certain lengths, widths, and/or depths of particular components shown and described for a particular assembly provide overall geometries which may be varied by changing certain sub-sets of such dimensions, but may also be fixed relative to the ratios of these values despite the valued changing (so long as their general relationship remains). Similarly, such dimensions of different component parts also have similar relative relationships which are similarly contemplated, also as apparent to one of ordinary skill.

[0084] When implemented in software, the elements of the embodiments of the invention are essentially the code segments or instructions to perform the functional tasks described herein. The code segments or instructions are executable by a processor, such as signal processor **201**, or one or more processors **259**, and can be stored in a storage device or a processor readable storage medium awaiting execution. The processor readable storage medium may include any medium that can store information. Examples of the processor readable storage medium include an electronic circuit, a semiconductor memory device, a read only memory (ROM), a flash memory, an erasable programmable read only memory (EPROM), a floppy diskette, a CD-ROM, an optical disk, a hard disk. The code segments or instructions may be downloaded via computer networks such as the Internet, Intranet, etc. into the processor readable storage medium.

[0085] While certain embodiments of the disclosure have been described, these embodiments have been presented by way of example only, and are not intended to limit the scope of the disclosure. Indeed, the novel methods, systems, and devices described herein may be embodied in a variety of other forms. Furthermore, various omissions, substitutions and changes in the form of the methods, systems, and devices described herein may be made without departing from the spirit of the disclosure. For example, certain features that are described in this specification in the context of separate implementations may also be implemented in combination in a single implementation. Conversely, various features that are described in the context of a single implementation may also be implemented in multiple implementations, separately or in sub-combination. Various combinations and sub-combinations, and modifications as may be made, of the presently disclosed components and embodiments and aspects are contemplated whether or not specifically disclosed hereunder, to the extent and as would be apparent to one of ordinary skill based upon review of this disclosure and in order to suit a particular intended purpose or application.

[0086] Moreover, although features may be described above as acting in certain combinations and even initially claimed as such, one or more features from a claimed combination may in some cases be excised from the combination, and the claimed combination may be directed to a sub-combination or variations of a sub-combination. Accordingly, the claimed invention is to be limited only by patented claims that follow below.

1. A method for a cuff-less blood pressure scanner, the method comprising:

receiving biometric information of a user into the cuff-less blood pressure scanner;

- downloading seed blood pressure data from a seed blood pressure database into a local storage device based on the biometric information of the user;
- initializing a blood pressure model of a signal processor in communication with the local storage device, the blood pressure model being initialized with a plurality of parameters based on the seed blood pressure data; and
- periodically tuning the plurality of parameters of the blood pressure model based on paired reference blood pressure measurements and reference blood pressure scans of the user.
2. The method of claim 1, further comprising: initiating a blood pressure scan to generate an inference of absolute blood pressure values of the user with a plurality of bio-sensors.
 3. The method of claim 1, further comprising: adapting the blood pressure model to a first updated blood pressure model.
 4. The method of claim 3, further comprising: initiating a blood pressure scan to generate an inference of change in blood pressure values of the user.
 5. The method of claim 4, further comprising: adapting the blood pressure model to a second updated blood pressure model.
 6. The method of claim 5, further comprising: initiating a blood pressure scan to generate an inference of change in blood pressure values of the user and an inference of absolute blood pressure values of the user.
 7. A method for a cuff-less blood pressure scanner, the method comprising:
 - capturing a plurality of synchronized sensor signals with a plurality of biosensors of a cuff-less blood pressure scanner;
 - extracting a plurality of physiological features from the plurality of synchronized sensor signals;
 - monitoring values of one or more extracted physiological features over time to determine an expected range of values for the one or more extracted physiological features;
 - detecting a value for at least one of the one or more extracted physiological features that is outside the expected range of values for the at least one extracted physiological feature; and
 - informing a user to tune parameters of an adaptive blood pressure model associated with the cuff-less blood pressure scanner in response to the value for the at least one extracted physiological feature being outside the expected range of values.
 8. The method of claim 7, further comprising:
 - performing a reference blood pressure measurement with a blood pressure cuff;
 - concurrently performing a reference blood pressure scan with the blood pressure scanner; and
 - storing the reference blood pressure measurement and the reference blood pressure scan into a local reference database.
 9. The method of claim 8, further comprising:
 - tuning parameters of the blood pressure model in response to a plurality of stored pairs of reference blood pressure measurements and reference blood pressure scans.
 10. An apparatus for gauging blood pressure, the apparatus comprising:
 - a cuff-less blood pressure (BP) scanner for electronically gauging blood pressure, the cuff-less BP scanner comprising
 - a plurality of electronic bio-sensors to concurrently contact a user and generate a plurality of electronic signals;
 - a signal processor coupled to the plurality of electronic bio-sensors, the signal processor being clocked to simultaneously receive the plurality of electronic signals from the plurality of biosensors synchronized together by a clock signal, the signal processor including
 - a plurality of adaptive filters coupled to the plurality of electronic bio-sensors, the plurality of adaptive filters to detect a plurality of desired electronic signals respectively in the plurality of electronic signals;
 - a plurality of physiological feature extractors respectively coupled to one or more of the plurality of adaptive filters, the plurality of physiological feature extractors to extract a plurality of desired physiological features from one or more of the plurality of desired electronic signals; and
 - an adaptive BP model coupled to the plurality of physiological feature extractors to receive the plurality of physiological features extracted from the one or more of the plurality of desired electronic signals, the adaptive BP model to calculate blood pressure of a user in response to the plurality of electronic signals based on the plurality of physiologic features, wherein the calculation of the blood pressure of the user by the adaptive BP model is further based on one or more biometric features associated with the user and a plurality of parameters generated from anonymous seed BP data and prior user BP data.
 - 11. The apparatus of claim 10, wherein the cuff-less BP scanner further comprises
 - a local storage device coupled to the signal processor, the local storage device storing the anonymous seed BP data in a seed BP database and the prior user BP data in a user BP database.
 - 12. The apparatus of claim 10, wherein the prior user BP data includes a plurality of paired reference data each including measured blood pressure, scanned blood pressure, and biometric data associated with the user.
 - 13. The apparatus of claim 12, wherein the anonymous seed BP data includes a plurality of paired reference data each including measured blood pressure, scanned blood pressure, and biometric data associated with a plurality of anonymous subjects.
 - 14. The apparatus of claim 13, wherein the anonymous seed BP data is selected so that the biometric data associated with the plurality of anonymous subjects is similar to the biometric data associated with the user.
 - 15. The apparatus of claim 10, wherein the plurality of adaptive filters are responsive to respective physiology-based models based on what feature is being extracted and what is being captured.
 - 16. The apparatus of claim 10, wherein
 - a plurality of desired electronic signals are fused together by a fusion and interaction process to form other desired electronic signals from which features are

extracted by one or more feature extractors to generate
one or more physiological features.
17-28. (canceled)

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专利名称(译)	无袖多传感器系统，用于逐步学习/调整血压统计推断		
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摘要(译)

在本发明的一个实施例中，公开了一种无袖套血压测量系统，包括无袖带血压扫描仪，其具有具有自适应血压模型的生命体征信号处理器。还公开了一种机器学习过程，以将无袖套血压测量系统的自适应血压模型调谐给用户。

