United States Patent	12395809
Kind Code	B2
Date of Patent	August 19, 2025
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Audibility at user location through mutual device audibility

Abstract

Some methods involve causing a plurality of audio devices in an audio environment to reproduce audio data, each audio device of the plurality of audio devices including at least one loudspeaker and at least one microphone, determining audio device location data including an audio device location for each audio device of the plurality of audio devices and obtaining microphone data from each audio device of the plurality of audio devices. Some methods involve determining a mutual audibility for each audio device of the plurality of audio devices relative to each other audio device of the plurality of audio devices, determining a user location of a person in the audio environment, determining a user location audibility of each audio device of the plurality of audio devices at the user location and controlling one or more aspects of audio device playback based, at least in part, on the user location audibility.

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Appl. No.:	**18/327797**
Filed (or PCT Filed):	**December 02, 2021**
PCT No.:	**PCT/US2021/061506**
PCT Pub. No.:	**WO2022/119990**

Prior Publication Data

Document Identifier	Publication Date
US 20240187811 A1	Jun. 06, 2024

Foreign Application Priority Data

ES	ES202031212	Dec. 31, 2020
ES	ES202130458	May. 20, 2021
ES	ES202130724	Jul. 26, 2021

Related U.S. Application Data

us-provisional-application US 63120887 20201203
us-provisional-application US 63121007 20201203
us-provisional-application US 63155369 20210302
us-provisional-application US 63201561 20210504
us-provisional-application US 63203403 20210721
us-provisional-application US 63224778 20210722
us-provisional-application US 63261769 20210928

Publication Classification

Int. Cl.: H04S7/00 (20060101)

U.S. Cl.:

CPC   **H04S7/303** (20130101); **H04S7/307** (20130101); H04S2400/11 (20130101); H04S2400/13 (20130101); H04S2400/15 (20130101)

Field of Classification Search

USPC: None

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Primary Examiner: Truong; Kenny H

Background/Summary

CROSS-REFERENCE TO RELATED APPLICATIONS (1) This application is U.S. National Stage of PCT Application No. PCT/US2021/061506, filed Dec. 2, 2021, which claims priority to the following applications: U.S. Provisional Application No. 63/121,007 filed Dec. 3, 2020; U.S. Provisional Application No. 63/261,769 filed Sep. 28, 2021; Spanish Patent Application No. P202130724 filed Jul. 26, 2021; U.S. Provisional Application No. 63/120,887 filed Dec. 3, 2020; U.S. Provisional Application No. 63/201,561 filed May 4, 2021; Spanish Patent Application No. P202031212 filed Dec. 3, 2020; Spanish Patent Application No. P202130458 filed May 20, 2021; U.S. Provisional Application No. 63/155,369 filed Mar. 2, 2021; U.S. Provisional Application No. 63/203,403 filed Jul. 21, 2021; U.S. Provisional Application No. 63/224,778 filed Jul. 22, 2021; each of which is hereby incorporated by reference in its entirety.

TECHNICAL FIELD

(1) This disclosure pertains to devices, systems and methods for determining audibility at a user

location and for processing audio for playback according to the audibility at the user location.

BACKGROUND

(2) Audio devices are widely deployed in many homes, vehicles and other environments. Although existing systems and methods for controlling audio devices provide benefits, improved systems and methods would be desirable.

NOTATION AND NOMENCLATURE

(3) Throughout this disclosure, including in the claims, the terms "speaker," "loudspeaker" and "audio reproduction transducer" are used synonymously to denote any sound-emitting transducer (or set of transducers). A typical set of headphones includes two speakers. A speaker may be implemented to include multiple transducers (e.g., a woofer and a tweeter), which may be driven by a single, common speaker feed or multiple speaker feeds. In some examples, the speaker feed(s) may undergo different processing in different circuitry branches coupled to the different transducers.

(4) Throughout this disclosure, including in the claims, the expression performing an operation "on" a signal or data (e.g., filtering, scaling, transforming, or applying gain to, the signal or data) is used in a broad sense to denote performing the operation directly on the signal or data, or on a processed version of the signal or data (e.g., on a version of the signal that has undergone preliminary filtering or pre-processing prior to performance of the operation thereon).

(5) Throughout this disclosure including in the claims, the expression "system" is used in a broad sense to denote a device, system, or subsystem. For example, a subsystem that implements a decoder may be referred to as a decoder system, and a system including such a subsystem (e.g., a system that generates X output signals in response to multiple inputs, in which the subsystem generates M of the inputs and the other X-M inputs are received from an external source) may also be referred to as a decoder system.

(6) Throughout this disclosure including in the claims, the term "processor" is used in a broad sense to denote a system or device programmable or otherwise configurable (e.g., with software or firmware) to perform operations on data (e.g., audio, or video or other image data). Examples of processors include a field-programmable gate array (or other configurable integrated circuit or chip set), a digital signal processor programmed and/or otherwise configured to perform pipelined processing on audio or other sound data, a programmable general purpose processor or computer, and a programmable microprocessor chip or chip set.

(7) As used herein, a "smart device" is an electronic device, generally configured for communication with one or more other devices (or networks) via various wireless protocols such as Bluetooth, Zigbee, near-field communication, Wi-Fi, light fidelity (Li-Fi), 3G, 4G, 5G, etc., that can operate to some extent interactively and/or autonomously. Several notable types of smart devices are smartphones, smart cars, smart thermostats, smart doorbells, smart locks, smart refrigerators, phablets and tablets, smartwatches, smart bands, smart key chains and smart audio devices. The term "smart device" may also refer to a device that exhibits some properties of ubiquitous computing, such as artificial intelligence.

(8) Herein, we use the expression "smart audio device" to denote a smart device that is either a single-purpose audio device or a multi-purpose audio device (e.g., a smart speaker or other audio device that implements at least some aspects of virtual assistant functionality). A single-purpose audio device is a device (e.g., a television (TV)) including or coupled to at least one microphone (and optionally also including or coupled to at least one speaker and/or at least one camera), and which is designed largely or primarily to achieve a single purpose. For example, although a TV typically can play (and is thought of as being capable of playing) audio from program material, in most instances a modern TV runs some operating system on which applications run locally, including the application of watching television. In this sense, a single-purpose audio device having speaker(s) and microphone(s) is often configured to run a local application and/or service to use the speaker(s) and microphone(s) directly. Some single-purpose audio devices may be configured to

group together to achieve playing of audio over a zone or user configured area.

(9) One common type of multi-purpose audio device is an audio device (e.g., a smart speaker) that implements at least some aspects of virtual assistant functionality, although other aspects of virtual assistant functionality may be implemented by one or more other devices, such as one or more servers with which the multi-purpose audio device is configured for communication. Such a multi-purpose audio device may be referred to herein as a "virtual assistant." A virtual assistant is a device (e.g., a smart speaker or voice assistant integrated device) including or coupled to at least one microphone (and optionally also including or coupled to at least one speaker and/or at least one camera). In some examples, a virtual assistant may provide an ability to utilize multiple devices (distinct from the virtual assistant) for applications that are in a sense cloud-enabled or otherwise not completely implemented in or on the virtual assistant itself. In other words, at least some aspects of virtual assistant functionality, e.g., speech recognition functionality, may be implemented (at least in part) by one or more servers or other devices with which a virtual assistant may communication via a network, such as the Internet. Virtual assistants may sometimes work together, e.g., in a discrete and conditionally defined way. For example, two or more virtual assistants may work together in the sense that one of them, e.g., the one which is most confident that it has heard a wakeword, responds to the wakeword. The connected virtual assistants may, in some implementations, form a sort of constellation, which may be managed by one main application which may be (or implement) a virtual assistant.

(10) As used herein, the terms "program stream" and "content stream" refer to a collection of one or more audio signals, and in some instances video signals, at least portions of which are meant to be heard together. Examples include a selection of music, a movie soundtrack, a movie, a television program, the audio portion of a television program, a podcast, a live voice call, a synthesized voice response from a smart assistant, etc. In some instances, the content stream may include multiple versions of at least a portion of the audio signals, e.g., the same dialogue in more than one language. In such instances, only one version of the audio data or portion thereof (e.g., a version corresponding to a single language) is intended to be reproduced at one time.

SUMMARY

(11) At least some aspects of the present disclosure may be implemented via methods. Some such methods may involve causing, by a control system, a plurality of audio devices in an audio environment to reproduce audio data. Each audio device of the plurality of audio devices may include at least one loudspeaker and at least one microphone. Some such methods may involve determining, by the control system, audio device location data including an audio device location for each audio device of the plurality of audio devices. Some such methods may involve obtaining, by the control system, microphone data from each audio device of the plurality of audio devices. The microphone data may correspond, at least in part, to sound reproduced by loudspeakers of other audio devices in the audio environment.

(12) Some such methods may involve determining, by the control system, a mutual audibility for each audio device of the plurality of audio devices relative to each other audio device of the plurality of audio devices. Some such methods may involve determining, by the control system, a user location of a person in the audio environment. Some such methods may involve determining, by the control system, a user location audibility of each audio device of the plurality of audio devices at the user location.

(13) Some such methods may involve controlling one or more aspects of audio device playback based, at least in part, on the user location audibility. In some examples, the one or more aspects of audio device playback may include leveling and/or equalization.

(14) In some implementations, determining the audio device location data may involve an audio device auto-location process. In some such implementations, the audio device auto-location process may involve obtaining direction of arrival data for each audio device of the plurality of audio devices. Alternatively, or additionally, in some examples the audio device auto-location process

may involve obtaining time of arrival data for each audio device of the plurality of audio devices. According to some implementations, determining the user location may be based, at least in part, on direction of arrival data and/or time of arrival data corresponding to one or more utterances of the person.

(15) In some examples, determining the mutual audibility for each audio device may involve determining a mutual audibility matrix. In some such examples, determining the mutual audibility matrix may involve a process of mapping decibels relative to full scale to decibels of sound pressure level. According to some implementations, the mutual audibility matrix may include measured transfer functions between each audio device of the plurality of audio devices. In some examples, the mutual audibility matrix may include values for each frequency band of a plurality of frequency bands.

(16) Some methods may involve determining an interpolated mutual audibility matrix by applying an interpolant to measured audibility data. In some examples, determining the interpolated mutual audibility matrix may involve applying a decay law model that is based in part on a distance decay constant. In some examples, the distance decay constant may include a per-device parameter and/or an audio environment parameter. In some instances, the decay law model may be frequency band based. According to some examples, the decay law model may include a critical distance parameter.

(17) Some methods may involve estimating an output gain for each audio device of the plurality of audio devices according to values of the mutual audibility matrix and the decay law model. In some examples, estimating the output gain for each audio device may involve determining a least squares solution to a function of values of the mutual audibility matrix and the decay law model. Some methods may involve determining values for the interpolated mutual audibility matrix according to a function of the output gain for each audio device, the user location and each audio device location. In some examples, the values for the interpolated mutual audibility matrix may correspond to the user location audibility of each audio device.

(18) Some methods may involve equalizing frequency band values of the interpolated mutual audibility matrix. Some methods may involve applying a delay compensation vector to the interpolated mutual audibility matrix.

(19) According to some implementations, the audio environment may include at least one output-only audio device having at least one loudspeaker but no microphone. In some such examples, the method may involve determining the audibility of the at least one output-only audio device at the audio device location of each audio device of the plurality of audio devices.

(20) In some implementations, the audio environment may include one or more input-only audio devices having at least one microphone but no loudspeaker. In some such examples, the method may involve determining an audibility of each loudspeaker-equipped audio device in the audio environment at a location of each of the one or more input-only audio devices.

(21) In some examples, the method may involve causing, by the control system, each audio device of the plurality of audio devices to insert one or more frequency range gaps into audio data being reproduced by one or more loudspeakers of each audio device.

(22) According to some examples, causing the plurality of audio devices to reproduce audio data may involve causing each audio device of the plurality of audio devices to play back audio when all other audio devices in the audio environment are not playing back audio.

(23) Some or all of the operations, functions and/or methods described herein may be performed by one or more devices according to instructions (e.g., software) stored on one or more non-transitory media. Such non-transitory media may include memory devices such as those described herein, including but not limited to random access memory (RAM) devices, read-only memory (ROM) devices, etc. Accordingly, some innovative aspects of the subject matter described in this disclosure can be implemented via one or more non-transitory media having software stored thereon.

(24) At least some aspects of the present disclosure may be implemented via apparatus. For

example, one or more devices may be capable of performing, at least in part, the methods disclosed herein. In some implementations, an apparatus may include an interface system and a control system. The control system may include one or more general purpose single- or multi-chip processors, digital signal processors (DSPs), application specific integrated circuits (ASICs), field programmable gate arrays (FPGAs) or other programmable logic devices, discrete gates or transistor logic, discrete hardware components, or combinations thereof. In some examples, the apparatus may be an audio device, such as one of the audio devices disclosed herein. However, in some implementations the apparatus may be another type of device, such as a mobile device, a laptop, a server, etc. In some implementations, the apparatus may be an orchestrating device, such as what is referred to herein as a smart home hub, or via another type of orchestrating device.

(25) Details of one or more implementations of the subject matter described in this specification are set forth in the accompanying drawings and the description below. Other features, aspects, and advantages will become apparent from the description, the drawings, and the claims. Note that the relative dimensions of the following figures may not be drawn to scale.

Description

BRIEF DESCRIPTION OF THE DRAWINGS

(1) FIG. **1** is a block diagram that shows examples of components of an apparatus capable of implementing various aspects of this disclosure.

(2) FIG. **2** depicts an audio environment, which is a living space in this example.

(3) FIGS. **3**A, **3**B and **3**C are block diagrams that represent three types of disclosed implementations.

(4) FIG. **4** shows an example of a heat map.

(5) FIG. **5** is a block diagram that shows an example of one implementation.

(6) FIG. **6** is a flow diagram that outlines one example of a method that may be performed by an apparatus or system such as those shown in FIGS. **1**, **2** and **5**.

(7) FIG. **7** is a block diagram that shows an example of a system according to another implementation.

(8) FIG. **8** is a flow diagram that outlines one example of a method that may be performed by an apparatus or system such as those shown in FIGS. **1**, **2** and **7**.

(9) FIG. **9** shows another example of a heat map.

(10) FIG. **10** shows an example of a floor plan of another audio environment, which is a living space in this instance.

(11) FIG. **11** shows an example of geometric relationships between four audio devices in an environment.

(12) FIG. **12** shows an audio emitter located within the audio environment of FIG. **11**.

(13) FIG. **13** shows an audio receiver located within the audio environment of FIG. **11**.

(14) FIG. **14** is a flow diagram that outlines one example of a method that may be performed by a control system of an apparatus such as that shown in FIG. **1**.

(15) FIG. **15** is a flow diagram that outlines an example of a method for automatically estimating device locations and orientations based on DOA data.

(16) FIG. **16** is a flow diagram that outlines one example of a method for automatically estimating device locations and orientations based on DOA data and TOA data.

(17) FIG. **17** is a flow diagram that outlines another example of a method for automatically estimating device locations and orientations based on DOA data and TOA data.

(18) FIG. **18**A shows an example of an audio environment.

(19) FIG. **18**B shows an additional example of determining listener angular orientation data.

(20) FIG. **18**C shows an additional example of determining listener angular orientation data.

(21) FIG. **18**D shows one example of determine an appropriate rotation for the audio device coordinates in accordance with the method described with reference to FIG. **18**C.

(22) FIG. **19** is a flow diagram that outlines one example of a localization method.

(23) FIG. **20** is a flow diagram that outlines another example of a localization method.

(24) FIG. **21**A shows an example of an audio environment.

(25) FIG. **21**B is an example of a spectrogram of modified audio playback signal.

(26) FIG. **22**A is a graph that shows an example of a gap in the frequency domain.

(27) FIG. **22**B is a graph that shows an example of a gap in the time domain.

(28) FIG. **22**C shows an example of modified audio playback signals including orchestrated gaps for multiple audio devices of an audio environment.

(29) FIG. **23**A is a graph that shows examples of a filter response used for creating a gap and a filter response used to measure a frequency region of a microphone signal used during a measurement session.

(30) FIGS. **23**B, **23**C, **23**D, **23**E, **23**F, **23**G, **23**H, **23**I and **23**J are graphs that show examples of gap allocation strategies.

(31) FIGS. **24**, **25**A and **25**B are flow diagrams that show examples of how multiple audio devices coordinate measurement sessions according to some implementations.

DETAILED DESCRIPTION OF EMBODIMENTS

(32) FIG. **1** is a block diagram that shows examples of components of an apparatus capable of implementing various aspects of this disclosure. According to some examples, the apparatus **100** may be, or may include, a smart audio device that is configured for performing at least some of the methods disclosed herein. In other implementations, the apparatus **100** may be, or may include, another device that is configured for performing at least some of the methods disclosed herein, such as a laptop computer, a cellular telephone, a tablet device, a smart home hub, etc. In some such implementations the apparatus **100** may be, or may include, a server. In some implementations the apparatus **100** may be configured to implement what may be referred to herein as an "orchestrating device" or an "audio session manager."

(33) In this example, the apparatus **100** includes an interface system **105** and a control system **110**. The interface system **105** may, in some implementations, be configured for communication with one or more devices that are executing, or configured for executing, software applications. Such software applications may sometimes be referred to herein as "applications" or simply "apps." The interface system **105** may, in some implementations, be configured for exchanging control information and associated data pertaining to the applications. The interface system **105** may, in some implementations, be configured for communication with one or more other devices of an audio environment. The audio environment may, in some examples, be a home audio environment. In other examples, the audio environment may be another type of environment, such as an office environment, a vehicle environment, a park or other outdoor environment, etc. The interface system **105** may, in some implementations, be configured for exchanging control information and associated data with audio devices of the audio environment. The control information and associated data may, in some examples, pertain to one or more applications with which the apparatus **100** is configured for communication.

(34) The interface system **105** may, in some implementations, be configured for receiving audio program streams. The audio program streams may include audio signals that are scheduled to be reproduced by at least some speakers of the environment. The audio program streams may include spatial data, such as channel data and/or spatial metadata. The interface system **105** may, in some implementations, be configured for receiving input from one or more microphones in an environment.

(35) The interface system **105** may include one or more network interfaces and/or one or more external device interfaces (such as one or more universal serial bus (USB) interfaces). According to some implementations, the interface system **105** may include one or more wireless interfaces. The

interface system **105** may include one or more devices for implementing a user interface, such as one or more microphones, one or more speakers, a display system, a touch sensor system and/or a gesture sensor system. In some examples, the interface system **105** may include one or more interfaces between the control system **110** and a memory system, such as the optional memory system **115** shown in FIG. **1**. However, the control system **110** may include a memory system in some instances.

(36) The control system **110** may, for example, include a general purpose single- or multi-chip processor, a digital signal processor (DSP), an application specific integrated circuit (ASIC), a field programmable gate array (FPGA) or other programmable logic device, discrete gate or transistor logic, and/or discrete hardware components.

(37) In some implementations, the control system **110** may reside in more than one device. For example, a portion of the control system **110** may reside in a device within one of the environments depicted herein and another portion of the control system **110** may reside in a device that is outside the environment, such as a server, a mobile device (e.g., a smartphone or a tablet computer), etc. In other examples, a portion of the control system **110** may reside in a device within one of the environments depicted herein and another portion of the control system **110** may reside in one or more other devices of the environment. For example, control system functionality may be distributed across multiple smart audio devices of an environment, or may be shared by an orchestrating device (such as what may be referred to herein as a smart home hub) and one or more other devices of the environment. The interface system **105** also may, in some such examples, reside in more than one device.

(38) In some implementations, the control system **110** may be configured for performing, at least in part, the methods disclosed herein. Some or all of the methods described herein may be performed by one or more devices according to instructions (e.g., software) stored on one or more non-transitory media. Such non-transitory media may include memory devices such as those described herein, including but not limited to random access memory (RAM) devices, read-only memory (ROM) devices, etc. The one or more non-transitory media may, for example, reside in the optional memory system **115** shown in FIG. **1** and/or in the control system **110**. Accordingly, various innovative aspects of the subject matter described in this disclosure can be implemented in one or more non-transitory media having software stored thereon. The software may, for example, include instructions for controlling at least one device to process audio data. The software may, for example, be executable by one or more components of a control system such as the control system **110** of FIG. **1**.

(39) In some examples, the apparatus **100** may include the optional microphone system **120** shown in FIG. **1**. The optional microphone system **120** may include one or more microphones. In some implementations, one or more of the microphones may be part of, or associated with, another device, such as a speaker of the speaker system, a smart audio device, etc. In some examples, the apparatus **100** may not include a microphone system **120**. However, in some such implementations the apparatus **100** may nonetheless be configured to receive microphone data for one or more microphones in an audio environment via the interface system **110**.

(40) According to some implementations, the apparatus **100** may include the optional loudspeaker system **125** shown in FIG. **1**. The optional loudspeaker system **125** may include one or more loudspeakers, which also may be referred to herein as "speakers." In some examples, at least some loudspeakers of the optional loudspeaker system **125** may be arbitrarily located. For example, at least some speakers of the optional loudspeaker system **125** may be placed in locations that do not correspond to any standard prescribed loudspeaker layout, such as Dolby 5.1, Dolby 5.1.2, Dolby 7.1, Dolby 7.1.4, Dolby 9.1, Hamasaki 22.2, etc. In some such examples, at least some loudspeakers of the optional speaker system **125** may be placed in locations that are convenient to the space (e.g., in locations where there is space to accommodate the loudspeakers), but not in any standard prescribed loudspeaker layout. In some examples, the apparatus **100** may not include a

loudspeaker system **125**.

(41) In some implementations, the apparatus **100** may include the optional sensor system **129** shown in FIG. **1**. The optional sensor system **129** may include one or more cameras, touch sensors, gesture sensors, motion detectors, etc. According to some implementations, the optional sensor system **129** may include one or more cameras. In some implementations, the cameras may be free-standing cameras. In some examples, one or more cameras of the optional sensor system **129** may reside in a smart audio device, which may be a single purpose audio device or a virtual assistant. In some such examples, one or more cameras of the optional sensor system **129** may reside in a TV, a mobile phone or a smart speaker. In some examples, the apparatus **100** may not include a sensor system **129**. However, in some such implementations the apparatus **100** may nonetheless be configured to receive sensor data for one or more sensors in an audio environment via the interface system **110**.

(42) In some implementations, the apparatus **100** may include the optional display system **135** shown in FIG. **1**. The optional display system **135** may include one or more displays, such as one or more light-emitting diode (LED) displays. In some instances, the optional display system **135** may include one or more organic light-emitting diode (OLED) displays. In some examples wherein the apparatus **100** includes the display system **135**, the sensor system **129** may include a touch sensor system and/or a gesture sensor system proximate one or more displays of the display system **135**. According to some such implementations, the control system **110** may be configured for controlling the display system **135** to present one or more graphical user interfaces (GUIs).

(43) According to some such examples the apparatus **100** may be, or may include, a smart audio device. In some such implementations the apparatus **100** may be, or may include, a wakeword detector. For example, the apparatus **100** may be, or may include, a virtual assistant.

(44) Legacy systems employing canonical loudspeaker layouts, such as Dolby 5.1, assume that loudspeakers have been placed in predetermined positions and that a listener is sitting in the sweet spot facing the front sound stage, e.g., facing the center speaker. The advent of smart speakers, some of which may incorporate multiple drive units and microphone arrays, in addition to existing audio devices including televisions and sound bars, and new microphone and loudspeaker-enabled connected devices such as lightbulbs and microwaves, creates a problem in which dozens of microphones and loudspeakers need locating relative to one another in order to achieve orchestration. Audio devices can no longer be assumed to lie in canonical layouts. In some instances, the audio devices in an audio environment may be randomly located, or at least may be distributed within the environment in an irregular and/or asymmetric manner.

(45) Flexible rendering is a technique for rendering spatial audio over an arbitrary number of arbitrarily-placed loudspeakers. With the widespread deployment of smart audio devices (e.g., smart speakers) in the home, as well as other audio devices that may not be located according to any standard canonical loudspeaker layout, it can be advantageous to implement flexible rendering of audio data and playback of the so-rendered audio data.

(46) Several technologies have been developed to implement flexible rendering, including Center of Mass Amplitude Panning (CMAP) and Flexible Virtualization (FV). Both of these technologies cast the rendering problem as one of cost function minimization, where the cost function includes at least a first term that models the desired spatial impression that the renderer is trying to achieve and a second term that assigns a cost to activating speakers. Detailed examples of CMAP, FV and combinations thereof are described in International Publication No. WO 2021/021707 A1, published on 4 Feb. 2021 and entitled "MANAGING PLAYBACK OF MULTIPLE STREAMS OF AUDIO OVER MULTIPLE SPEAKERS," on page 25, line 8 through page 31, line 27, which are hereby incorporated by reference.

(47) An orchestrated system of smart audio devices configured to operate according to a flexible rendering method gives the user the flexibility to place audio devices at arbitrary locations in an audio environment while nonetheless having audio data played back in a satisfactory manner. In

some such examples, a system of such smart audio devices may be configured to self-organize (e.g., via an auto-location process) and calibrate automatically. In some examples, audio device calibration may be conceptualized as having several layers. One layer may be geometric mapping, which involves discovering the physical location and orientation of audio devices, the user, and possibly additional noise sources and legacy audio devices such as televisions and/or soundbars, for which various methods are disclosed herein. It is important that a flexible renderer be provided accurate geometric mapping information in order to render a sound scene correctly.

(48) The present assignee has produced several loudspeaker localization techniques that are excellent solutions in the use cases for which they were designed. Some such methods are described in detail herein. Some of the embodiments disclosed in this application allow for the localization of a collection of audio devices based on 1) the DOA between each pair of audio devices in an audio environment, and 2) the minimization of a non-linear optimization problem designed for input of data type 1). Other embodiments disclosed in the application allow for the localization of a collection of smart audio devices based on 1) the DOA between each pair of audio devices in the system, 2) the TOA between each pair of devices, and 3) the minimization of a non-linear optimization problem designed for input of data types 1) and 2). Some examples of automatically determining the location and orientation of a person in an audio environment are also disclosed herein. Details of some such methods are described below.

(49) A second layer of calibration may involve leveling and equalization of loudspeaker output in order to account for various factors, such as manufacturing variations in the loudspeakers, the effect of loudspeaker locations and orientations in the audio environment, and audio environment acoustics. In some legacy examples, in particular with soundbars and audio/video receivers (AVRs), the user may optionally apply manual gains and equalization (EQ) curves or plug in a dedicated reference microphone at the listening location for calibration. However, the proportion of the population willing to go to these lengths is known to be very small. Therefore, it would be desirable for an orchestrated system of smart devices to be configured for automatic playback level and EQ calibration without the use of reference microphones, a process that may be referred to herein as audibility mapping. In some examples, geometric mapping and audibility mapping may form the two main components of acoustic mapping.

(50) Some disclosed implementations treat audibility mapping as a sparse interpolation problem using the mutual audibility measured between audio devices and the estimated physical locations (and in some instances orientations) of audio devices and one or more people in an audio environment. The context of such implementations may be better appreciated with reference to a specific example of an audio environment.

(51) FIG. **2** depicts an audio environment, which is a living space in this example. As with other figures provided herein, the types, numbers and arrangements of elements shown in FIG. **2** are merely provided by way of example. Other implementations may include more, fewer and/or different types, numbers and/or arrangements of elements. In other examples, the audio environment may be another type of environment, such as an office environment, a vehicle environment, a park or other outdoor environment, etc. In this example, the elements of FIG. **2** include the following: **201**: A person, who also may be referred to as a "user" or a "listener"; **202**: A smart speaker including one or more loudspeakers and one or more microphones; **203**: A smart speaker including one or more loudspeakers and one or more microphones; **204**: A smart speaker including one or more loudspeakers and one or more microphones; **205**: A smart speaker including one or more loudspeakers and one or more microphones; **206**: A sound source, which may be a noise source, which is located in the same room of the audio environment in which the person **201** and the smart speakers **202-206** are located and which has a known location. In some examples, the sound source **206** may be a legacy device, such as a radio, that is not part of an audio system that includes the smart speakers **202-206**. In some instances, the volume of the sound source **206** may not be continuously adjustable by the person **201** and may not be adjustable by an orchestrating

device. For example, the volume of the sound source **206** may be adjustable only by a manual process, e.g., via an on/off switch or by choosing a power or speed level (e.g., a power or speed level of a fan or an air conditioner); and **207**: A sound source, which may be a noise source, which is not located in the same room of the audio environment in which the person **201** and the smart speakers **202-206** are located. In some examples, the sound source **207** may not have a known location. In some instances, the sound source **207** may be diffuse.

(52) The following discussion involves a few underlying assumptions. For example, it is assumed that estimates of the locations of audio devices (such as the smart devices **102-105** of FIG. **2**) and an estimate of a listener location (such as the location of the person **101**) are available. Additionally, it is assumed that a measure of mutual audibility between audio devices is known. This measure of mutual audibility may, in some examples, be in the form of the received level in multiple frequency bands. Some examples are described below. In other examples, the measure of mutual audibility may be a broadband measure, such as a measure that includes only one frequency band.

(53) The reader may question whether the microphones in consumer devices provide uniform responses, because unmatched microphone gains would add a layer of ambiguity. However, the majority of smart speakers include Micro-Electro-Mechanical Systems (MEMS) microphones, which are exceptionally well matched (at worst ±3 dB but typically within ±1 dB) and have a finite set of acoustic overload points, such that the absolute mapping from digital dBFS (decibels relative to full scale) to dBSPL (decibels of sound pressure level) can be determined by the model number and/or a device descriptor. As such, MEMS microphones can be assumed to provide a well-calibrated acoustic reference for mutual audibility measurements.

(54) FIGS. **3**A, **3**B and **3**C are block diagrams that represent three types of disclosed implementations. FIG. **3**A represents an implementation that involves estimating the audibility (in this example, in dBSPL) at a user location (e.g., the location of the person **201** of FIG. **2**) of all audio devices in an audio environment (e.g., the locations of the smart speakers **202-205**), based upon mutual audibility between the audio devices, their physical locations, and the location of the user. Such implementations do not require the use of a reference microphone at the user location. In some such examples, audibility may be normalized by the digital level (in this example, in dBFS) of the loudspeaker driving signal to yield transfer functions between each audio device and the user. According to some examples, the implementation represented by FIG. **3**A is essentially a sparse interpolation problem: given banded levels measured between a set of audio devices at known locations, apply a model to estimate the levels received at the listener location.

(55) In the example shown in FIG. **3**A, a full matrix spatial audibility interpolator is shown receiving device geometry information (audio device location information) a mutual audibility matrix (an example of which is described below) and user location information, and outputting interpolated transfer functions. In this example the interpolated transfer functions are from dBFS to dBSPL, which may be useful for leveling and equalizing audio devices, such as smart devices. In some examples, there may be some null rows or columns in the audibility matrix corresponding to input-only or output-only devices. Implementation details corresponding to the example of FIG. **3**A are set forth below in the "Full Matrix Mutual Audibility Implementations" discussion below.

(56) FIG. **3**B represents an implementation that involves estimating the audibility (in this example, in dBSPL) at a user location of an uncontrolled point source (such as the sound source **206** of FIG. **2**), based upon the audibility of the uncontrolled point source at the audio devices, the physical locations of the audio devices, the location of the uncontrolled point source and the location of the user. In some examples, the uncontrolled point source may be a noise source located in the same room as the audio devices and the person. In the example shown in FIG. **3**B, a point source spatial audibility interpolator is shown receiving device geometry information (audio device location information) an audibility matrix (an example of which is described below) and sound source location information, and outputting interpolated audibility information.

(57) FIG. **3**C represents an implementation that involves estimating the audibility (in this example, in dBSPL) at a user location of a diffuse and/or unlocated and uncontrolled source (such as the sound source **207** of FIG. **2**), based upon the audibility of the sound source at each of the audio devices, the physical locations of the audio devices and the location of the user. In this implementation, the location of the sound source is assumed to be unknown. In the example shown in FIG. **3**C, a naïve spatial audibility interpolator is shown receiving device geometry information (audio device location information) and an audibility matrix (an example of which is described below), and outputting interpolated audibility information. In some examples, the interpolated audibility information referenced in FIGS. **3**B and **3**C may indicate interpolated audibility in dBSPL, which may be useful for estimating the received level from sound sources (e.g., from noise sources). By interpolating received levels of noise sources, noise compensation (e.g., a process of increasing the gain of content in the bands where noise is present) may be applied more accurately than can be achieved with reference to noise detected by a single microphone.

(58) Full Matrix Mutual Audibility Implementations

(59) Table 1 indicates what the terms of the equations in the following discussion represent.

(60) TABLE-US-00001 TABLE 1 Total devices L Total spectral bands K Band index k Total microphones in device i M_i Rotation scalar ϕ Mutual audibility transfer function matrix H ∈ custom character $.sup.K\times L\times L$ Noise audibility level matrix A ∈ custom character $.sup.K\times L$ Elements of noise audibility level matrix $A_i.sup.(k)$ $i.sup.th$ device location vector x_i = $[x_i\ y_i].sup.T$ User location vector x_u = $[x_u\ y_u].sup.T$ Noise location vector x_n = $[x_n\ y_n].sup.T$ Geometry vector X ∈ custom character $.sup.L\times 2$ Output sensitivity $g_i.sup.(k)$ Decay law $\alpha_i.sup.(k)$ Critical distance $d_c.sup.i$ Interpolated transfer function matrix B ∈ custom character $.sup.K\times L$ Interpolated noise level vector b ∈ custom character $.sup.K\times 1$ EQ and compensation gains matrix G ∈ custom character $.sup.K\times L$ Delay compensation vector τ ∈ custom character $.sup.L\times 1$ Noise compensation gains q ∈ custom character $.sup.K\times 1$

(61) Let L be the total number of audio devices, each containing M_i microphones, and let K be the total number of spectral bands reported by the audio devices. According to this example, a mutual audibility matrix H∈custom character$.sup.K\times L\times L$, containing measured transfer functions between all devices in all bands in linear units, is determined.

(62) Several examples exist for determining H. However, the disclosed implementations are agnostic to the method used to determine H.

(63) Some examples of determining H may involve multiple iterations of "one shot" calibration performed by each of the audio devices in turn, with controlled sources such as swept sines, noise sources, or curated program material. In some such examples, determining H may involve a sequential process of causing a single smart audio device to emit a sound while the other smart audio devices "listen" for the sound.

(64) For example, referring to FIG. **2**, one such process may involve: (a) causing the audio device **202** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **203**-**205**; then (b) causing the audio device **203** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **204** and **205**; then (c) causing the audio device **204** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **203** and **205**; then (d) causing the audio device **205** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **203** and **204**. The emitted sounds may or may not be the same, depending on the particular implementation.

(65) Some "continuous" calibration methods that are described in detail below involve measuring transfer functions beneath an audible threshold. These examples involve spectral hole punching

(also referred to herein as forming "gaps").

(66) According to some implementations, audio devices including multiple microphones may estimate multiple audibility matrices (e.g., one for each microphone) that are averaged to yield a single audibility matrix for each device. In some examples anomalous data, which may be due to malfunctioning microphones, may be detected and removed.

(67) As noted above, the spatial locations x.sub.i of the audio devices in 2D or 3D coordinates are also assumed available. Some examples for determining device locations based upon time of arrival (TOA), direction of arrival (DOA) and combinations of DOA and TOA are described below. In other examples, the spatial locations x.sub.i of the audio devices may be determined by manual measurements, e.g., with a measuring tape.

(68) Moreover, the location of the user x.sub.u is also assumed known, and in some cases both the location and the orientation of the user also may be known. Some methods for determining a listener location and a listener orientation are described in detail below. According to some examples, the device locations X=[x.sub.1 x.sub.2 . . . x.sub.L].sup.T may have been translated so that x.sub.u lies at the origin of a coordinate system.

(69) According to some implementations, the aim is to estimate an interpolated mutual audibility matrix B by applying a suitable interpolant to the measured data. In one example, a decay law model of the following form may be chosen:

(70) $\dfrac{g_i^{(k)}}{\text{.Math. } x_i - x_j \text{ .Math. }^{(k)}_i}$

(71) In this example, x.sub.i represents the location of the transmitting device, x.sub.j represents the location of the receiving device, g.sub.i.sup.(k) represents an unknown linear output gain in band k, and α.sub.i.sup.(k) represents a distance decay constant. The least squares solution

(72) $\{\hat{g}_i^{(k)}, \hat{a}_i^{(k)}\} = \underset{j=0, j\neq i}{\text{argmin} \, \text{.Math.}} \, \text{.Math. } H_{ij}^{(k)} - \dfrac{g_i^{(k)}}{\text{.Math. } x_i - x_j \text{ .Math. }^{(k)}_i} \, \text{.Math.}^2$ yields estimated parameters {ĝ.sub.i.sup.(k),{circumflex over (α)}.sub.i.sup.(k)} for the ith transmitting device. The estimated audibility in linear units at the user location may therefore be represented as follows:

(73) $B_i^{(k)} = \dfrac{\hat{g}_i^{(k)}}{\text{.Math. } x_i - x_u \text{ .Math. }^{\wedge(k)}_i}$.

(74) In some embodiments, {circumflex over (α)}.sub.i.sup.(k) may be constrained to a global room parameter {circumflex over (α)}.sup.(k), and may, in some examples, be additionally constrained to lie within a specific range of values.

(75) FIG. **4** shows an example of a heat map. In this example, the heat map **400** represents an estimated transfer function for one frequency band from a sound source (o) to any point in a room having the x and y dimensions indicated in FIG. **4**. The estimated transfer function is based on the interpolation of measurements of the sound source by **4** receivers (x). The interpolated level is depicted by the heatmap **400** for any user location x.sub.u within the room.

(76) In another example, the distance decay model may include a critical distance parameter such that the interpolant takes the following form:

(77) $g_i^{(k)} \sqrt{\dfrac{1}{\text{.Math. } x_i - x_j \text{ .Math. }^2_2} + \dfrac{1}{(d_c^i)^2}}$

(78) In this example, d.sub.c.sup.l represents a critical distance that may, in some examples, be solved as a global room parameter d.sub.c and/or may be constrained to lie within a fixed range of values.

(79) FIG. **5** is a block diagram that shows an example of one implementation. As with other figures provided herein, the types, numbers and arrangements of elements shown in FIG. **5** are merely provided by way of example. Other implementations may include more, fewer and/or different types, numbers and/or arrangements of elements. In this example, a full matrix spatial audibility interpolator **505**, a delay compensation block **510**, an equalization and gain compensation block **515** and a flexible renderer block **520** are implemented by an instance of the control system **110** of

the apparatus **100** that is described above with reference to FIG. **1**. In some implementations, the apparatus **100** may be an orchestrating device for the audio environment. According to some examples, the apparatus **100** may be one of the audio devices of the audio environment. In some instances, the full matrix spatial audibility interpolator **505**, the delay compensation block **510**, the equalization and gain compensation block **515** and the flexible renderer block **520** may be implemented via instructions (e.g., software) stored on one or more non-transitory media.

(80) In some examples, the full matrix spatial audibility interpolator **505** may be configured to calculate an estimated audibility at a lister's location as described above. According to this example, the equalization and gain compensation block **515** is configured to determine an equalization and compensation gain matrix **517** (shown as $G \in$ ⬚custom character.sup.K×L in Table 1) based on the frequency bands of the interpolated audibility $B.sub.i.sup.(k)$ **507** received from the full matrix spatial audibility interpolator **505**. The equalization and compensation gain matrix **517** may, in some instances, be determined using standardized techniques. For example, the estimated levels at the user location may be smoothed across frequency bands and equalization (EQ) gains may be calculated such that the result matches a target curve. In some implementations, a target curve may be spectrally flat. In other examples, a target curve may roll off gently towards high frequencies to avoid over-compensation. In some instances, the EQ frequency bands may then be mapped into a different set of frequency bands corresponding to the capabilities of a particular parametric equalizer. In some examples, the different set of frequency bands may be the 77 CQMF bands mentioned elsewhere herein. In other examples, the different set of frequency bands may include a different number of frequency bands, e.g., 20 critical bands or as few as two frequency bands (high and low). Some implementations of a flexible renderer may use 20 critical bands.

(81) In this example, the processes of applying compensation gains and EQ are split out so that compensation gains provide rough overall level matching and EQ provides finer control in multiple bands. According to some alternative implementations, compensation gains and EQ may be implemented as a single process.

(82) In this example, the flexible renderer block **520** is configured to render the audio data of the program content **530** according to corresponding spatial information (e.g., positional metadata) of the program content **530**. The flexible renderer block **520** may be configured to implement CMAP, FV, a combination of CMAP and FV, or another type of flexible rendering, depending on the particular implementation. According to this example, the flexible renderer block **520** is configured to use the equalization and compensation gain matrix **517** in order to ensure that each loudspeaker is heard by the user at the same level with the same equalization. The loudspeaker signals **525** output by the flexible renderer block **520** may be provided to audio devices of an audio system.

(83) According to this implementation, the delay compensation block **510** is configured to determine a delay compensation information **512** (which may in some examples be, or include, the delay compensation vector shown as $\tau \in$ ⬚custom character.sup.L×1 in Table 1) according to audio device geometry information and user location information. The delay compensation information **512** is based on the time required for sound to travel the distances between the user location and the locations of each of the loudspeakers. According to this example, the flexible renderer block **520** is configured to apply the delay compensation information **512** to ensure that the time of arrival to the user of corresponding sounds played back from all loudspeakers is constant.

(84) FIG. **6** is a flow diagram that outlines one example of a method that may be performed by an apparatus or system such as those shown in FIGS. **1**, **2** and **5**. The blocks of method **600**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described. The blocks of method **600** may be performed by one or more devices, which may be (or may include) a control system such as the control system **110** shown in FIGS. **1**, **3** and **4**, and described above, or one of the other disclosed control system examples. According to some examples, the blocks of method **600** may be implemented by one or more devices according to instructions (e.g., software) stored on one or

more non-transitory media.

(85) In this implementation, block **605** involves causing, by a control system, a plurality of audio devices in an audio environment to reproduce audio data. In this example, each audio device of the plurality of audio devices includes at least one loudspeaker and at least one microphone. However, in some such examples the audio environment may include at least one output-only audio device having at least one loudspeaker but no microphone. Alternatively, or additionally, in some such examples the audio environment may include one or more input-only audio devices having at least one microphone but no loudspeaker. Some examples of method **600** in such contexts are described below.

(86) According to this example, block **610** involves determining, by the control system, audio device location data including an audio device location for each audio device of the plurality of audio devices. In some examples, block **610** may involve determining the audio device location data by reference to previously-obtained audio device location data that is stored in a memory (e.g., in the memory system **115** of FIG. **1**). In some instances, block **610** may involve determining the audio device location data via an audio device auto-location process. The audio device auto-location process may involve performing one or more audio device auto-location methods, such as the DOA-based and/or TOA-based audio device auto-location methods referenced elsewhere herein.

(87) According to this implementation, block **615** involves obtaining, by the control system, microphone data from each audio device of the plurality of audio devices. In this example, the microphone data corresponds, at least in part, to sound reproduced by loudspeakers of other audio devices in the audio environment.

(88) In some examples, causing the plurality of audio devices to reproduce audio data may involve causing each audio device of the plurality of audio devices to play back audio when all other audio devices in the audio environment are not playing back audio. For example, referring to FIG. **2**, one such process may involve: (a) causing the audio device **202** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **203-205**; then (b) causing the audio device **203** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **204** and **205**; then (c) causing the audio device **204** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **203** and **205**; then (d) causing the audio device **205** to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **202**, **203** and **204**. The emitted sounds may or may not be the same, depending on the particular implementation.

(89) Other examples of block **615** may involve obtaining the microphone data while content is being played back by each of the audio devices. Some such examples may involve spectral hole punching (also referred to herein as forming "gaps"). Accordingly, some such examples may involve causing, by the control system, each audio device of the plurality of audio devices to insert one or more frequency range gaps into audio data being reproduced by one or more loudspeakers of each audio device.

(90) In this example, block **620** involves determining, by the control system, a mutual audibility for each audio device of the plurality of audio devices relative to each other audio device of the plurality of audio devices. In some implementations, block **620** may involve determining a mutual audibility matrix, e.g., as described above. In some examples, determining the mutual audibility matrix may involve a process of mapping decibels relative to full scale to decibels of sound pressure level. In some implementations, the mutual audibility matrix may include measured transfer functions between each audio device of the plurality of audio devices. In some examples, the mutual audibility matrix may include values for each frequency band of a plurality of frequency bands.

(91) According to this implementation, block **625** involves determining, by the control system, a

user location of a person in the audio environment. In some examples, determining the user location may be based, at least in part, on at least one of direction of arrival data or time of arrival data corresponding to one or more utterances of the person. Some detailed examples of determining a user location of a person in an audio environment are described below.

(92) In this example, block **630** involves determining, by the control system, a user location audibility of each audio device of the plurality of audio devices at the user location. According to this implementation, block **635** involves controlling one or more aspects of audio device playback based, at least in part, on the user location audibility. In some examples, the one or more aspects of audio device playback may include leveling and/or equalization, e.g., as described above with reference to FIG. **5**.

(93) According to some examples, block **620** (or another block of method **600**) may involve determining an interpolated mutual audibility matrix by applying an interpolant to measured audibility data. In some examples, determining the interpolated mutual audibility matrix may involve applying a decay law model that is based in part on a distance decay constant. In some examples, the distance decay constant may include a per-device parameter and/or an audio environment parameter. In some instances, the decay law model may be frequency band based. According to some examples, the decay law model may include a critical distance parameter.

(94) In some examples, method **600** may involve estimating an output gain for each audio device of the plurality of audio devices according to values of the mutual audibility matrix and the decay law model. In some instances, estimating the output gain for each audio device may involve determining a least squares solution to a function of values of the mutual audibility matrix and the decay law model. In some examples, method **600** may involve determining values for the interpolated mutual audibility matrix according to a function of the output gain for each audio device, the user location and each audio device location. In some examples, the values for the interpolated mutual audibility matrix may correspond to the user location audibility of each audio device.

(95) According to some examples, method **600** may involve equalizing frequency band values of the interpolated mutual audibility matrix. In some examples, method **600** may involve applying a delay compensation vector to the interpolated mutual audibility matrix.

(96) As noted above, in some implementations the audio environment may include at least one output-only audio device having at least one loudspeaker but no microphone. In some such examples, method **600** may involve determining the audibility of the at least one output-only audio device at the audio device location of each audio device of the plurality of audio devices.

(97) As noted above, in some implementations the audio environment may include one or more input-only audio devices having at least one microphone but no loudspeaker. In some such examples, method **600** may involve determining an audibility of each loudspeaker-equipped audio device in the audio environment at a location of each of the one or more input-only audio devices.

(98) Point Noise Source Case Implementations

(99) This section discloses implementations that correspond with FIG. **3**B. As used in this section, a "point noise source" refers to a noise source for which the location $x.sub.n$ is available but the source signal is not, one example of which is when the sound source **206** of FIG. **2** is a noise source. Instead of (or in addition to) determining a mutual audibility matrix that corresponds to the mutual audibility of each of a plurality of audio devices in the audio environment, implementations of the "point noise source case" involve determining the audibility of such a point source at each of a plurality of audio device locations. Some such examples involve determining a noise audibility matrix $A \in$ custom character.sup.K=L that measures the received level of such a point source at each of a plurality of audio device locations, not a transfer function as in the full matrix spatial audibility examples described above.

(100) In some embodiments, the estimation of A may be made in real time, e.g., during a time at which audio is being played back in an audio environment. According to some implementations,

the estimation of A may be part of a process of compensation for the noise of the point source (or other sound source of known location).

(101) FIG. **7** is a block diagram that shows an example of a system according to another implementation. As with other figures provided herein, the types, numbers and arrangements of elements shown in FIG. **7** are merely provided by way of example. Other implementations may include more, fewer and/or different types, numbers and/or arrangements of elements. According to this example, control systems **100**A-**110**L correspond to audio devices **701**A-**701**L (where L is two or more) and are instances of the control system **110** of the apparatus **100** that is described above with reference to FIG. **1**. Here, the control systems **100**A-**110**L are implementing multichannel acoustic echo cancellers **705**A-**705**L.

(102) In this example, a point source spatial audibility interpolator **710** and a noise compensation block **715** are implemented by the control system **110**M of the apparatus **720**, which is another instance of the apparatus **100** that is described above with reference to FIG. **1**. In some examples, the apparatus **720** may be what is referred to herein as an orchestrating device or a smart home hub. However, in alternative examples the apparatus **720** may be an audio device. In some instances, the functionality of the apparatus **720** may be implemented by one of the audio devices **701**A-**701**L. In some instances, the multichannel acoustic echo cancellers **705**A-**705**L, the point source spatial audibility interpolator **710** and/or the noise compensation block **715** may be implemented via instructions (e.g., software) stored on one or more non-transitory media.

(103) In this example, a sound source **725** is producing sound **730** in the audio environment. According to this example, the sound **730** will be regarded as noise. In this instance, the sound source **725** is not operating under the control of any of the control systems **110**A-**110**M. In this example, the location of the sound source **725** is known by (in other words, provided to and/or stored in a memory accessible by) the control system **110**M.

(104) According to this example, the multichannel acoustic echo canceller **705**A receives microphone signals **702**A from one or more microphones of the audio device **701**A and a local echo reference **703**A that corresponds with audio being played back by the audio device **701**A. Here, the multichannel acoustic echo canceller **705**A is configured to produce the residual microphone signal **707**A (which also may be referred to as an echo-canceled microphone signal) and to provide the residual microphone signal **707**A to the apparatus **720**. In this example, it is assumed that the residual microphone signal **707**A corresponds mainly to the sound **730** received at the location of the audio device **701**A.

(105) Similarly, the multichannel acoustic echo canceller **705**L receives microphone signals **702**L from one or more microphones of the audio device **701**L and a local echo reference **703**L that corresponds with audio being played back by the audio device **701**L. The multichannel acoustic echo canceller **705**L is configured to output the residual microphone signal **707**L to the apparatus **720**. In this example, it is assumed that the residual microphone signal **707**L corresponds mainly to the sound **730** received at the location of the audio device **701**L. In some examples, the multichannel acoustic echo cancellers **705**A-**705**L may be configured for echo cancellation in each of K frequency bands.

(106) In this example, the point source spatial audibility interpolator **710** receives the residual microphone signals **707**A-**707**L, as well as audio device geometry (location data for each of the audio devices **701**A-**701**L) and source location data. According to this example, the point source spatial audibility interpolator **710** is configured for determining noise audibility information that indicates the received level of the sound **730** at each of the locations of the audio devices **701**A-**701**L. In some examples, the noise audibility information may include noise audibility data for each of K frequency bands and may, in some instances, be the noise audibility matrix A$\in$ custom character.sup.K×L referenced above.

(107) In some implementations, the point source spatial audibility interpolator **710** (or another block of the control system **110**M) may be configured to estimate, based on user location data and

the received level of the sound **730** at each of the locations of the audio devices **701**A-**701**L, a noise audibility information **712** that indicates the level of the sound **730** at a user location in the audio environment. In some instances, estimating the noise audibility information **712** may involve an interpolation process such as those described above, e.g., by applying a distance attenuation model to estimate the noise level vector b∈ custom character.sup.K×1 at the user location.

(108) According to this example, the noise compensation block **715** is configured to determine noise compensation gains **717** based on the estimated noise level **712** at the user location. In this example, the noise compensation gains **717** are multi-band noise compensation gains (e.g., the noise compensation gains q∈ custom character.sup.K×1 that are referenced above), which may differ according to frequency band. For example, the noise compensation gains may be higher in frequency bands corresponding to higher estimated levels of the sound **730** at the user position. In some examples, the noise compensation gains **717** are provided to the audio devices **701**A-**701**L, so that the audio devices **701**A-**701**L may control playback of audio data in accordance with the noise compensation gains **717**. As suggested by the dashed lines **717**A and **717**L, in some instances the noise compensation block **715** may configured to determine noise compensation gains that are specific to each of the audio devices **701**A-**701**L.

(109) FIG. **8** is a flow diagram that outlines one example of a method that may be performed by an apparatus or system such as those shown in FIGS. **1**, **2** and **7**. The blocks of method **800**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described. The blocks of method **800** may be performed by one or more devices, which may be (or may include) a control system such as those shown in FIGS. **1**, **3** and **7**, and described above, or one of the other disclosed control system examples. According to some examples, the blocks of method **800** may be implemented by one or more devices according to instructions (e.g., software) stored on one or more non-transitory media.

(110) In this implementation, block **805** involves receiving, by a control system, residual microphone signals from each of a plurality of microphones in an audio environment. In this example, the residual microphone signals correspond to sound from a noise source received at each of a plurality of audio device locations. In the example described above with reference to FIG. **7**, block **805** involves the control system **110**M receiving the residual microphone signals **707**A-**707**L from the multichannel acoustic echo cancelers **705**A-**705**L. However, in some alternative implementations, one or more of blocks **805**-**825** (and in some instances, all of blocks **805**-**825**) may be performed by another control system, such as one of the audio device control systems **110**A-**110**L.

(111) According to this example, block **810** involves obtaining, by the control system, audio device location data corresponding to each of the plurality of audio device locations, noise source location data corresponding to a location of the noise source and user location data corresponding to a location of a person in the audio environment. In some examples, block **810** may involve determining the audio device location data, the noise source location data and/or the user location data by reference to previously-obtained audio device location data that is stored in a memory (e.g., in the memory system **115** of FIG. **1**). In some instances, block **810** may involve determining the audio device location data, the noise source location data and/or the user location data via an auto-location process. The auto-location process may involve performing one or more auto-location methods, such as the auto-location methods referenced elsewhere herein.

(112) According to this implementation, block **815** involves estimating, based on the residual microphone signals, the audio device location data, the noise source location data and the user location data, a noise level of sound from the noise source at the user location. In the example described above with reference to FIG. **7**, block **815** may involve the point source spatial audibility interpolator **710** (or another block of the control system **110**M) estimating, based on user location data and the received level of the sound **730** at each of the locations of the audio devices **701**A-

701L, a noise level **712** of the sound **730** at a user location in the audio environment. In some instances, block **815** may involve an interpolation process such as those described above, e.g., by applying a distance attenuation model to estimate the noise level vector b∈ custom character .sup.K×1 at the user location.

(113) In this example, block **820** involves determining noise compensation gains for each of the audio devices based on the estimated noise level of sound from the noise source at the user location. In the example described above with reference to FIG. **7**, block **820** may involve the noise compensation block **715** determining the noise compensation gains **717** based on the estimated noise level **712** at the user location. In some examples, the noise compensation gains may be multi-band noise compensation gains (e.g., the noise compensation gains q∈ custom character.sup.K×1 that are referenced above), which may differ according to the frequency band.

(114) According to this implementation, block **825** involves providing the noise compensation gains to each of the audio devices. In the example described above with reference to FIG. **7**, block **825** may involve the apparatus **720** providing the noise compensation gains **717**A-**717**L to each of the audio devices **701**A-**701**L.

(115) Diffuse or Unlocated Noise Source Implementations

(116) Locating a sound source, such as a noise source, may not always be possible, in particular when the sound source is not located in the same room or the sound source is highly occluded to the microphone array(s) detecting the sound. In such instances, estimating the noise level at a user location may be regarded as a sparse interpolation problem with a few known noise level values (e.g., one at each microphone or microphone array of each of a plurality of audio devices in the audio environment).

(117) Such an interpolation may be expressed as a general function $f:$ custom character .sup.2.fwdarw. custom character, which represents interpolating known points in 2D space (represented by the custom character.sup.2 term) to an interpolated scalar value (represented by custom character). One example involves selection of subsets of three nodes (corresponding to microphones or microphone arrays of three audio devices in the audio environment) to form a triangle of nodes and solving for audibility within the triangle by bivariate linear interpolation. For any given node i, one can represent the received level in the kth band as A.sub.i.sup. (k)=ax.sub.i+by.sub.i+c. Solving for the unknowns,

$$(118) \begin{bmatrix} a \\ b \\ c \end{bmatrix} = \begin{bmatrix} x_1 & y_1 & 1 \\ x_2 & y_2 & 1 \\ x_3 & y_3 & 1 \end{bmatrix}^{-1} \begin{bmatrix} A_1^{(k)} \\ A_2^{(k)} \\ A_3^{(k)} \end{bmatrix}.$$

(119) The interpolated audibility at any arbitrary point within the triangle becomes Â.sub.i.sup.(k)=$ax+by+c$.

(120) Other examples may involve barycentric interpolation or cubic triangular interpolation, e.g., as described in Amidror, Isaac, "Scattered data interpolation methods for electronic imaging systems: a survey," in *Journal of Electronic Imaging* Vol. 11, No. 2, April 2002, pp. 157-176, which is hereby incorporated by reference. Such interpolation methods are applicable to the noise compensation methods described above with reference to FIGS. **7** and **8**, e.g., by replacing the point source spatial audibility interpolator **710** of FIG. **7** with a naïve spatial interpolator implemented according to any of the interpolation methods described in this section and by omitting the process of obtaining noise source location data in block **810** of FIG. **8**. The interpolation methods described in this section do not yield a spherical distance decay, but do provide plausible level interpolation within a listening area.

(121) FIG. **9** shows another example of a heat map. In this example, the heat map **900** represents an estimated transfer function for one frequency band from a sound source (o) having an unknown location to any point in a room having the x and y dimensions indicated in FIG. **9**. The estimated

transfer function is based on the interpolation of measurements of the sound source by 5 receivers (x). The interpolated level is depicted by the heatmap **900** for any user location x.sub.u within the room.

(122) FIG. **10** shows an example of a floor plan of another audio environment, which is a living space in this instance. As with other figures provided herein, the types and numbers of elements shown in FIG. **10** are merely provided by way of example. Other implementations may include more, fewer and/or different types and numbers of elements.

(123) According to this example, the environment **1000** includes a living room **1010** at the upper left, a kitchen **1015** at the lower center, and a bedroom **1022** at the lower right. Boxes and circles distributed across the living space represent a set of loudspeakers **1005a-1005h**, at least some of which may be smart speakers in some implementations, placed in locations convenient to the space, but not adhering to any standard prescribed layout (arbitrarily placed). In some examples, the television **1030** may be configured to implement one or more disclosed embodiments, at least in part. In this example, the environment **1000** includes cameras **1011a-1011e**, which are distributed throughout the environment. In some implementations, one or more smart audio devices in the environment **1000** also may include one or more cameras. The one or more smart audio devices may be single purpose audio devices or virtual assistants. In some such examples, one or more cameras of the optional sensor system **130** may reside in or on the television **1030**, in a mobile phone or in a smart speaker, such as one or more of the loudspeakers **1005b**, **1005d**, **1005e** or **1005h**. Although cameras **1011a-1011e** are not shown in every depiction of the environment **1000** presented in this disclosure, each of the environments **1000** may nonetheless include one or more cameras in some implementations.

(124) Automatic Localization of Audio Devices

(125) The present assignee has produced several speaker localization techniques for cinema and home that are excellent solutions in the use cases for which they were designed. Some such methods are based on time-of-flight derived from impulse responses between a sound source and microphone(s) that are approximately co-located with each loudspeaker. While system latencies in the record and playback chains may also be estimated, sample synchrony between clocks is required along with the need for a known test stimulus from which to estimate impulse responses.

(126) Recent examples of source localization in this context have relaxed constraints by requiring intra-device microphone synchrony but not requiring inter-device synchrony. Additionally, some such methods relinquish the need for passing audio between sensors by low-bandwidth message passing such as via detection of the time of arrival (TOA, also referred to as "time of flight") of a direct (non-reflected) sound or via detection of the dominant direction of arrival (DOA) of a direct sound. Each approach has some potential advantages and potential drawbacks. For example, some previously-deployed TOA methods can determine device geometry up to an unknown translation, rotation, and reflection about one of three axes. Rotations of individual devices are also unknown if there is just one microphone per device. Some previously-deployed DOA methods can determine device geometry up to an unknown translation, rotation, and scale. While some such methods may produce satisfactory results under ideal conditions, the robustness of such methods to measurement error has not been demonstrated.

(127) Some of the embodiments disclosed in this application allow for the localization of a collection of smart audio devices based on 1) the DOA between each pair of audio devices in an audio environment, and 2) the minimization of a non-linear optimization problem designed for input of data type 1). Other embodiments disclosed in the application allow for the localization of a collection of smart audio devices based on 1) the DOA between each pair of audio devices in the system, 2) the TOA between each pair of devices, and 3) the minimization of a non-linear optimization problem designed for input of data types 1) and 2).

(128) FIG. **11** shows an example of geometric relationships between four audio devices in an environment. In this example, the audio environment **1100** is a room that includes a television **1101**

and audio devices **1105***a*, **1105***b*, **1105***c* and **1105***d*. According to this example, the audio devices **1105***a*-**1105***d* are in locations **1** through **4**, respectively, of the audio environment **1100**. As with other examples disclosed herein, the types, numbers, locations and orientations of elements shown in FIG. **11** are merely made by way of example. Other implementations may have different types, numbers and arrangements of elements, e.g., more or fewer audio devices, audio devices in different locations, audio devices having different capabilities, etc.

(129) In this implementation, each of the audio devices **1105***a*-**1105***d* is a smart speaker that includes a microphone system and a speaker system that includes at least one speaker. In some implementations, each microphone system includes an array of at least three microphones. According to some implementations, the television **1101** may include a speaker system and/or a microphone system. In some such implementations, an automatic localization method may be used to automatically localize the television **1101**, or a portion of the television **1101** (e.g., a television loudspeaker, a television transceiver, etc.), e.g., as described below with reference to the audio devices **1105***a*-**1105***d*.

(130) Some of the embodiments described in this disclosure allow for the automatic localization of a set of audio devices, such as the audio devices **1105***a*-**1105***d* shown in FIG. **11**, based on either the direction of arrival (DOA) between each pair of audio devices, the time of arrival (TOA) of the audio signals between each pair of devices, or both the DOA and the TOA of the audio signals between each pair of devices. In some instances, as in the example shown in FIG. **11**, each of the audio devices is enabled with at least one driving unit and one microphone array, the microphone array being capable of providing the direction of arrival of an incoming sound. According to this example, the two-headed arrow **1110***ab* represents sound transmitted by the audio device **1105***a* and received by the audio device **1105***b*, as well as sound transmitted by the audio device **1105***b* and received by the audio device **1105***a*. Similarly, the two-headed arrows **1110***ac*, **1110***ad*, **1110***be*, **1110***bd*, and **1110***cd* represent sounds transmitted and received by audio devices **1105***a* and audio device **1105***c*, sounds transmitted and received by audio devices **1105***a* and audio device **1105***d*, sounds transmitted and received by audio devices **1105***b* and audio device **1105***c*, sounds transmitted and received by audio devices **1105***b* and audio device **1105***d*, and sounds transmitted and received by audio devices **1105***c* and audio device **1105***d*, respectively.

(131) In this example, each of the audio devices **1105***a*-**1105***d* has an orientation, represented by the arrows **1115***a*-**1115***d*, which may be defined in various ways. For example, the orientation of an audio device having a single loudspeaker may correspond to a direction in which the single loudspeaker is facing. In some examples, the orientation of an audio device having multiple loudspeakers facing in different directions may be indicated by a direction in which one of the loudspeakers is facing. In other examples, the orientation of an audio device having multiple loudspeakers facing in different directions may be indicated by the direction of a vector corresponding to the sum of audio output in the different directions in which each of the multiple loudspeakers is facing. In the example shown in FIG. **11**, the orientations of the arrows **1115***a*-**1115***d* are defined with reference to a Cartesian coordinate system. In other examples, the orientations of the arrows **1115***a*-**1115***d* may be defined with reference to another type of coordinate system, such as a spherical or cylindrical coordinate system.

(132) In this example, the television **1101** includes an electromagnetic interface **1103** that is configured to receive electromagnetic waves. In some examples, the electromagnetic interface **1103** may be configured to transmit and receive electromagnetic waves. According to some implementations, at least two of the audio devices **1105***a*-**1105***d* may include an antenna system configured as a transceiver. The antenna system may be configured to transmit and receive electromagnetic waves. In some examples, the antenna system includes an antenna array having at least three antennas. Some of the embodiments described in this disclosure allow for the automatic localization of a set of devices, such as the audio devices **1105***a*-**1105***d* and/or the television **1101** shown in FIG. **11**, based at least in part on the DOA of electromagnetic waves transmitted between

devices. Accordingly, the two-headed arrows **1110***ab*, **1110***ac*, **1110***ad*, **1110***bc*, **1110***bd*, and **1110***cd* also may represent electromagnetic waves transmitted between the audio devices **1105***a*-**1105***d*.

(133) According to some examples, the antenna system of a device (such as an audio device) may be co-located with a loudspeaker of the device, e.g., adjacent to the loudspeaker. In some such examples, an antenna system orientation may correspond with a loudspeaker orientation. Alternatively, or additionally, the antenna system of a device may have a known or predetermined orientation with respect to one or more loudspeakers of the device.

(134) In this example, the audio devices **1105***a*-**1105***d* are configured for wireless communication with one another and with other devices. In some examples, the audio devices **1105***a*-**1105***d* may include network interfaces that are configured for communication between the audio devices **1105***a*-**1105***d* and other devices via the Internet. In some implementations, the automatic localization processes disclosed herein may be performed by a control system of one of the audio devices **1105***a*-**1105***d*. In other examples, the automatic localization processes may be performed by another device of the audio environment **1100**, such as what may sometimes be referred to as a smart home hub, that is configured for wireless communication with the audio devices **1105***a*-**1105***d*. In other examples, the automatic localization processes may be performed, at least in part, by a device outside of the audio environment **1100**, such as a server, e.g., based on information received from one or more of the audio devices **1105***a*-**1105***d* and/or a smart home hub.

(135) FIG. **12** shows an audio emitter located within the audio environment of FIG. **11**. Some implementations provide automatic localization of one or more audio emitters, such as the person **1205** of FIG. **12**. In this example, the person **1205** is at location **5**. Here, sound emitted by the person **1205** and received by the audio device **1105***a* is represented by the single-headed arrow **1210***a*. Similarly, sounds emitted by the person **1205** and received by the audio devices **1105***b*, **1105***c* and **1105***d* are represented by the single-headed arrows **1210***b*, **1210***c* and **1210***d*. Audio emitters can be localized based on either the DOA of the audio emitter sound as captured by the audio devices **1105***a*-**1105***d* and/or the television **1101**, based on the differences in TOA of the audio emitter sound as measured by the audio devices **1105***a*-**1105***d* and/or the television **1101**, or based on both the DOA and the differences in TOA.

(136) Alternatively, or additionally, some implementations may provide automatic localization of one or more electromagnetic wave emitters. Some of the embodiments described in this disclosure allow for the automatic localization of one or more electromagnetic wave emitters, based at least in part on the DOA of electromagnetic waves transmitted by the one or more electromagnetic wave emitters. If an electromagnetic wave emitter were at location **5**, electromagnetic waves emitted by the electromagnetic wave emitter and received by the audio devices **1105***a*, **1105***b*, **1105***c* and **1105***d* also may be represented by the single-headed arrows **1210***a*, **1210***b*, **1210***c* and **1210***c*.

(137) FIG. **13** shows an audio receiver located within the audio environment of FIG. **11**. In this example, the microphones of a smartphone **1305** are enabled, but the speakers of the smartphone **1305** are not currently emitting sound. Some embodiments provide automatic localization one or more passive audio receivers, such as the smartphone **1305** of FIG. **13** when the smartphone **1305** is not emitting sound. Here, sound emitted by the audio device **1105***a* and received by the smartphone **1305** is represented by the single-headed arrow **1310***a*. Similarly, sounds emitted by the audio devices **1105***b*, **1105***c* and **1105***d* and received by the smartphone **1305** are represented by the single-headed arrows **1310***b*, **1310***c* and **1310***d*.

(138) If the audio receiver is equipped with a microphone array and is configured to determine the DOA of received sound, the audio receiver may be localized based, at least in part, on the DOA of sounds emitted by the audio devices **1105***a*-**1105***d* and captured by the audio receiver. In some examples, the audio receiver may be localized based, at least in part, on the difference in TOA of the smart audio devices as captured by the audio receiver, regardless of whether the audio receiver is equipped with a microphone array. Yet other embodiments may allow for the automatic localization of a set of smart audio devices, one or more audio emitters, and one or more receivers,

based on DOA only or DOA and TOA, by combining the methods described above.

(139) Direction of Arrival Localization

(140) FIG. **14** is a flow diagram that outlines one example of a method that may be performed by a control system of an apparatus such as that shown in FIG. **1**. The blocks of method **1400**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described.

(141) Method **1400** is an example of an audio device localization process. In this example, method **1400** involves determining the location and orientation of two or more smart audio devices, each of which includes a loudspeaker system and an array of microphones. According to this example, method **1400** involves determining the location and orientation of the smart audio devices based at least in part on the audio emitted by every smart audio device and captured by every other smart audio device, according to DOA estimation. In this example, the initial blocks of method **1400** rely on the control system of each smart audio device to be able to extract the DOA from the input audio obtained by that smart audio device's microphone array, e.g., by using the time differences of arrival between individual microphone capsules of the microphone array.

(142) In this example, block **1405** involves obtaining the audio emitted by every smart audio device of an audio environment and captured by every other smart audio device of the audio environment. In some such examples, block **1405** may involve causing each smart audio device to emit a sound, which in some instances may be a sound having a predetermined duration, frequency content, etc. This predetermined type of sound may be referred to herein as a structured source signal. In some implementations, the smart audio devices may be, or may include, the audio devices **1105***a*-**1105***d* of FIG. **11**.

(143) In some such examples, block **1405** may involve a sequential process of causing a single smart audio device to emit a sound while the other smart audio devices "listen" for the sound. For example, referring to FIG. **11**, block **1405** may involve: (a) causing the audio device **1105***a* to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **1105***b*-**1105***d*; then (b) causing the audio device **1105***b* to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **1105***a*, **1105***c* and **1105***d*; then (c) causing the audio device **1105***c* to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **1105***a*, **1105***b* and **1105***d*; then (d) causing the audio device **1105***d* to emit a sound and receiving microphone data corresponding to the emitted sound from microphone arrays of the audio devices **1105***a*, **1105***b* and **1105***c*. The emitted sounds may or may not be the same, depending on the particular implementation.

(144) In other examples, block **1405** may involve a simultaneous process of causing all smart audio devices to emit a sound while the other smart audio devices "listen" for the sound. For example, block **1405** may involve performing the following steps simultaneously: (1) causing the audio device **1105***a* to emit a first sound and receiving microphone data corresponding to the emitted first sound from microphone arrays of the audio devices **1105***b*-**1105***d*; (2) causing the audio device **1105***b* to emit a second sound different from the first sound and receiving microphone data corresponding to the emitted second sound from microphone arrays of the audio devices **1105***a*, **1105***c* and **1105***d*; (3) causing the audio device **1105***c* to emit a third sound different from the first sound and the second sound, and receiving microphone data corresponding to the emitted third sound from microphone arrays of the audio devices **1105***a*, **1105***b* and **1105***d*; (4) causing the audio device **1105***d* to emit a fourth sound different from the first sound, the second sound and the third sound, and receiving microphone data corresponding to the emitted fourth sound from microphone arrays of the audio devices **1105***a*, **1105***b* and **1105***c*.

(145) In some examples, block **1405** may be used to determine the mutual audibility of the audio devices in an audio environment. Some detailed examples are disclosed herein.

(146) In this example, block **1410** involves a process of pre-processing the audio signals obtained

via the microphones. Block **1410** may, for example, involve applying one or more filters, a noise or echo suppression process, etc. Some additional pre-processing examples are described below.

(147) According to this example, block **1415** involves determining DOA candidates from the pre-processed audio signals resulting from block **1410**. For example, if block **1405** involved emitting and receiving structured source signals, block **1415** may involve one or more deconvolution methods to yield impulse responses and/or "pseudo ranges," from which the time difference of arrival of dominant peaks can be used, in conjunction with the known microphone array geometry of the smart audio devices, to estimate DOA candidates.

(148) However, not all implementations of method **1400** involve obtaining microphone signals based on the emission of predetermined sounds. Accordingly, some examples of block **1415** include "blind" methods that are applied to arbitrary audio signals, such as steered response power, receiver-side beamforming, or other similar methods, from which one or more DOAs may be extracted by peak-picking. Some examples are described below. It will be appreciated that while DOA data may be determined via blind methods or using structured source signals, in most instances TOA data may only be determined using structured source signals. Moreover, more accurate DOA information may generally be obtained using structured source signals.

(149) According to this example, block **1420** involves selecting one DOA corresponding to the sound emitted by each of the other smart audio devices. In many instances, a microphone array may detect both direct arrivals and reflected sound that was transmitted by the same audio device. Block **1420** may involve selecting the audio signals that are most likely to correspond to directly transmitted sound. Some additional examples of determining DOA candidates and of selecting a DOA from two or more candidate DOAs are described below.

(150) In this example, block **1425** involves receiving DOA information resulting from each smart audio device's implementation of block **1420** (in other words, receiving a set of DOAs corresponding to sound transmitted from every smart audio device to every other smart audio device in the audio environment) and performing a localization method (e.g., implementing a localization algorithm via a control system) based on the DOA information. In some disclosed implementations, block **1425** involves minimizing a cost function, possibly subject to some constraints and/or weights, e.g., as described below with reference to FIG. **15**. In some such examples, the cost function receives as input data the DOA values from every smart audio device to every other smart device and returns as outputs the estimated location and the estimated orientation of each of the smart audio devices. In the example shown in FIG. **14**, block **1430** represents the estimated smart audio device locations and the estimated smart audio device orientations produced in block **1425**.

(151) FIG. **15** is a flow diagram that outlines another example of a method for automatically estimating device locations and orientations based on DOA data. Method **1500** may, for example, be performed by implementing a localization algorithm via a control system of an apparatus such as that shown in FIG. **1**. The blocks of method **1500**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described.

(152) According to this example, DOA data are obtained in block **1505**. According to some implementations, block **1505** may involve obtaining acoustic DOA data, e.g., as described above with reference to blocks **1405-1420** of FIG. **14**. Alternatively, or additionally, block **1505** may involve obtaining DOA data corresponding to electromagnetic waves that are transmitted by, and received by, each of a plurality of devices in an environment.

(153) In this example, the localization algorithm receives as input the DOA data obtained in block **1505** from every smart device to every other smart device in an audio environment, along with any configuration parameters **1510** specified for the audio environment. In some examples, optional constraints **1525** may be applied to the DOA data. The configuration parameters **1510**, minimization weights **1515**, the optional constraints **1525** and the seed layout **1530** may, for

example, be obtained from a memory by a control system that is executing software for implementing the cost function **1520** and the non-linear search algorithm **1535**. The configuration parameters **1510** may, for example, include data corresponding to maximum room dimensions, loudspeaker layout constraints, external input to set a global translation (e.g., 2 parameters), a global rotation (1 parameter), and a global scale (1 parameter), etc.

(154) According to this example, the configuration parameters **1510** are provided to the cost function **1520** and to the non-linear search algorithm **1535**. In some examples, the configuration parameters **1510** are provided to optional constraints **1525**. In this example, the cost function **1520** takes into account the differences between the measured DOAs and the DOAs estimated by an optimizer's localization solution.

(155) In some embodiments, the optional constraints **1525** impose restrictions on the possible audio device location and/or orientation, such as imposing a condition that audio devices are a minimum distance from each other. Alternatively, or additionally, the optional constraints **1525** may impose restrictions on dummy minimization variables introduced by convenience, e.g., as described below.

(156) In this example, minimization weights **1515** are also provided to the non-linear search algorithm **1535**. Some examples are described below.

(157) According to some implementations, the non-linear search algorithm **1535** is an algorithm that can find local solutions to a continuous optimization problem of the form:

(158) $\min C(x) x \in C^n$ suchthat $g_L \le g(x) \le g_U$ and $x_L \le x \le x_U$

(159) In the foregoing expressions, C(x): R.sup.n->R represent the cost function **1520**, and g(x): R.sup.n->R.sup.m represent constraint functions corresponding to the optional constraints **1525**. In these examples, the vectors g.sub.L and g.sub.U represent the lower and upper bounds on the constraints, and the vectors x.sub.L and x.sub.U represent the bounds on the variables x.

(160) The non-linear search algorithm **1535** may vary according to the particular implementation. Examples of the non-linear search algorithm **1535** include gradient descent methods, the Broyden-Fletcher-Goldfarb-Shanno (BFGS) method, interior point optimization (IPOPT) methods, etc. While some of the non-linear search algorithms require only the values of the cost functions and the constraints, some other methods also may require the first derivatives (gradients, Jacobians) of the cost function and constraints, and some other methods also may require the second derivatives (Hessians) of the same functions. If the derivatives are required, they can be provided explicitly, or they can be computed automatically using automatic or numerical differentiation techniques.

(161) Some non-linear search algorithms need seed point information to start the minimization, as suggested by the seed layout **1530** that is provided to the non-linear search algorithm **1535** in FIG. **15**. In some examples, the seed point information may be provided as a layout consisting of the same number of smart audio devices (in other words, the same number as the actual number of smart audio devices for which DOA data are obtained) with corresponding locations and orientations. The locations and orientations may be arbitrary, and need not be the actual or approximate locations and orientations of the smart audio devices. In some examples, the seed point information may indicate smart audio device locations that are along an axis or another arbitrary line of the audio environment, smart audio device locations that are along a circle, a rectangle or other geometric shape within the audio environment, etc. In some examples, the seed point information may indicate arbitrary smart audio device orientations, which may be predetermined smart audio device orientations or random smart audio device orientations.

(162) In some embodiments, the cost function **1520** can be formulated in terms of complex plane variables as follows:

(163) $C_{\mathrm{DOA}}(x,z) = \overset{N}{\underset{n=1}{.\mathrm{Math}.}} \overset{N}{\underset{\substack{m=1 \\ m \ne n}}{.\mathrm{Math}.}} w_{nm}^{\mathrm{DOA}} .\mathrm{Math}. Z_{nm} - z_n^* (\frac{x_m - x_n}{.\mathrm{Math}. x_m - x_n .\mathrm{Math}.}) .\mathrm{Math}.^2 ,$

wherein the star indicates complex conjugation, the bar indicates absolute value, and where: Z.sub.nm=exp(i DOA.sub.nm) represents the complex plane value giving the direction of arrival of smart device m as measured from device n, with i representing the imaginary unit;

$x.sub.n=x.sub.nx+ix.sub.ny$ represents the complex plane value encoding the x and y positions of the smart device n; $z.sub.n=exp(i\alpha.sub.n)$ represents the complex value encoding the angle $\alpha.sub.n$ of orientation of the smart device n; w.sub.nm.sup.DOA represents the weight given to the DOA.sub.nm measurement; N represents the number of smart audio devices for which DOA data are obtained; and x=(x.sub.1, . . . , x.sub.N) and z=(z.sub.1, . . . , z.sub.N) represent vectors of the complex positions and complex orientations, respectively, of all Nsmart audio devices.

(164) According to this example, the outcomes of the minimization are device location data **1540** indicating the 2D position of the smart devices, x.sub.k (representing 2 real unknowns per device) and device orientation data **1545** indicating the orientation vector of the smart devices z.sub.k (representing 2 additional real variables per device). From the orientation vector, only the angle of orientation of the smart device $\alpha.sub.k$ is relevant for the problem (1 real unknown per device). Therefore, in this example there are 3 relevant unknowns per smart device.

(165) In some examples, results evaluation block **1550** involves computing the residual of the cost function at the outcome position and orientations. A relatively lower residual indicates relatively more precise device localization values. According to some implementations, the results evaluation block **1550** may involve a feedback process. For example, some such examples may implement a feedback process that involves comparing the residual of a given DOA candidate combination with another DOA candidate combination, e.g., as explained in the DOA robustness measures discussion below.

(166) As noted above, in some implementations block **1505** may involve obtaining acoustic DOA data as described above with reference to blocks **1405-1420** of FIG. **14**, which involve determining DOA candidates and selecting DOA candidates. Accordingly, FIG. **15** includes a dashed line from the results evaluation block **1550** to block **1505**, to represent one flow of an optional feedback process. Moreover, FIG. **14** includes a dashed line from block **1430** (which may involve results evaluation in some examples) to DOA candidate selection block **1420**, to represent a flow of another optional feedback process.

(167) In some embodiments, the non-linear search algorithm **1535** may not accept complex-valued variables. In such cases, every complex-valued variable can be replaced by a pair of real variables.

(168) In some implementations, there may be additional prior information regarding the availability or reliability of each DOA measurement. In some such examples, loudspeakers may be localized using only a subset of all the possible DOA elements. The missing DOA elements may, for example, be masked with a corresponding zero weight in the cost function. In some such examples, the weights w.sub.nm may be either be zero or one, e.g., zero for those measurements which are either missing or considered not sufficiently reliable and one for the reliable measurements. In some other embodiments, the weights w.sub.nm may have a continuous value from zero to one, as a function of the reliability of the DOA measurement. In those embodiments in which no prior information is available, the weights w.sub.nm may simply be set to one.

(169) In some implementations, the conditions |z.sub.k|=1 (one condition for every smart audio device) may be added as constraints to ensure the normalization of the vector indicating the orientation of the smart audio device. In other examples, these additional constraints may not be needed, and the vector indicating the orientation of the smart audio device may be left unnormalized. Other implementations may add as constraints conditions on the proximity of the smart audio devices, e.g., indicating that |x.sub.n−x.sub.m|≥D, where D is the minimum distance between smart audio devices.

(170) The minimization of the cost function above does not fully determine the absolute position and orientation of the smart audio devices. According to this example, the cost function remains invariant under a global rotation (1 independent parameter), a global translation (2 independent parameters), and a global rescaling (1 independent parameter), affecting simultaneously all the smart devices locations and orientations. This global rotation, translation, and rescaling cannot be determined from the minimization of the cost function. Different layouts related by the symmetry

transformations are totally indistinguishable in this framework and are said to belong to the same equivalence class. Therefore, the configuration parameters should provide criteria to allow uniquely defining a smart audio device layout representing an entire equivalence class. In some embodiments, it may be advantageous to select criteria so that this smart audio device layout defines a reference frame that is close to the reference frame of a listener near a reference listening position. Examples of such criteria are provided below. In some other examples, the criteria may be purely mathematical and disconnected from a realistic reference frame.

(171) The symmetry disambiguation criteria may include a reference position, fixing the global translation symmetry (e.g., smart audio device **1** should be at the origin of coordinates); a reference orientation, fixing the two-dimensional rotation symmetry (e.g., smart device **1** should be oriented toward an area of the audio environment designated as the front, such as where the television **1101** is located in FIGS. **11**-**13**); and a reference distance, fixing the global scaling symmetry (e.g., smart device **2** should be at a unit distance from smart device **1**). In total, there are 4 parameters that cannot be determined from the minimization problem in this example and that should be provided as an external input. Therefore, in this example there are 3N−4 unknowns that can be determined from the minimization problem.

(172) As described above, in some examples, in addition to the set of smart audio devices, there may be one or more passive audio receivers, equipped with a microphone array, and/or one or more audio emitters. In such cases the localization process may use a technique to determine the smart audio device location and orientation, emitter location, and passive receiver location and orientation, from the audio emitted by every smart audio device and every emitter and captured by every other smart audio device and every passive receiver, based on DOA estimation.

(173) In some such examples, the localization process may proceed in a similar manner as described above. In some instances, the localization process may be based on the same cost function described above, which is shown below for the reader's convenience:

(174) $C_{\mathrm{DOA}}(x, z) = \sum_{n=1}^{N} \sum_{\substack{m=1 \\ m \neq n}}^{N} w_{nm}^{\mathrm{DOA}} \left\| Z_{nm} - z_n^* \left(\frac{x_m - x_n}{\| x_m - x_n \|} \right) \right\|^2$

(175) However, if the localization process involves passive audio receivers and/or audio emitters that are not audio receivers, the variables of the foregoing equation need to be interpreted in a slightly different way. Now N represents the total number of devices, including N.sub.smart smart audio devices, N.sub.rec passive audio receivers and N.sub.emit emitters, so that N=N.sub.smart+N.sub.rec+N.sub.emit. In some examples, the weights w.sub.nm.sup.DOA may have a sparse structure to mask out missing data due to passive receivers or emitter-only devices (or other audio sources without receivers, such as human beings), so that w.sub.nm.sup.DOA=0 for all m if device n is an audio emitter without a receiver, and w.sub.nm.sup.DOA=0 for all n if device m is an audio receiver. For both smart audio devices and passive receivers both the position and angle can be determined, whereas for audio emitters only the position can be obtained. The total number of unknowns is 3N.sub.smart+3N.sub.rec+2N.sub.emit−4.

(176) Combined Time of Arrival and Direction of Arrival Localization

(177) In the following discussion, the differences between the above-described DOA-based localization processes and the combined DOA and TOA localization of this section will be emphasized. Those details that are not explicitly given may be assumed to be the same as those in the above-described DOA-based localization processes.

(178) FIG. **16** is a flow diagram that outlines one example of a method for automatically estimating device locations and orientations based on DOA data and TOA data. Method **1600** may, for example, be performed by implementing a localization algorithm via a control system of an apparatus such as that shown in FIG. **1**. The blocks of method **1600**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described.

(179) According to this example, DOA data are obtained in blocks **1605**-**1620**. According to some

implementations, blocks **1605-1620** may involve obtaining acoustic DOA data from a plurality of smart audio devices, e.g., as described above with reference to blocks **1405-1420** of FIG. **14**. In some alternative implementations, blocks **1605-1620** may involve obtaining DOA data corresponding to electromagnetic waves that are transmitted by, and received by, each of a plurality of devices in an environment.

(180) In this example, however, block **1605** also involves obtaining TOA data. According to this example, the TOA data includes the measured TOA of audio emitted by, and received by, every smart audio device in the audio environment (e.g., every pair of smart audio devices in the audio environment). In some embodiments that involve emitting structured source signals, the audio used to extract the TOA data may be the same as was used to extract the DOA data. In other embodiments, the audio used to extract the TOA data may be different from that used to extract the DOA data.

(181) According to this example, block **1616** involves detecting TOA candidates in the audio data and block **1618** involves selecting a single TOA for each smart audio device pair from among the TOA candidates. Some examples are described below.

(182) Various techniques may be used to obtain the TOA data. One method is to use a room calibration audio sequence, such as a sweep (e.g., a logarithmic sine tone) or a Maximum Length Sequence (MLS). Optionally, either aforementioned sequence may be used with band-limiting to the close ultrasonic audio frequency range (e.g., 18 kHz to 24 kHz). In this audio frequency range most standard audio equipment is able to emit and record sound, but such a signal cannot be perceived by humans because it lies beyond the normal human hearing capabilities. Some alternative implementations may involve recovering TOA elements from a hidden signal in a primary audio signal, such as a Direct Sequence Spread Spectrum signal.

(183) Given a set of DOA data from every smart audio device to every other smart audio device, and the set of TOA data from every pair of smart audio devices, the localization method **1625** of FIG. **16** may be based on minimizing a certain cost function, possibly subject to some constraints. In this example, the localization method **1625** of FIG. **16** receives as input data the above-described DOA and TOA values, and outputs the estimated location data and orientation data **630** corresponding to the smart audio devices. In some examples, the localization method **1625** also may output the playback and recording latencies of the smart audio devices, e.g., up to some global symmetries that cannot be determined from the minimization problem. Some examples are described below.

(184) FIG. **17** is a flow diagram that outlines another example of a method for automatically estimating device locations and orientations based on DOA data and TOA data. Method **1700** may, for example, be performed by implementing a localization algorithm via a control system of an apparatus such as that shown in FIG. **1**. The blocks of method **1700**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described.

(185) Except as described below, in some examples blocks **1705**, **1710**, **1715**, **1720**, **1725**, **1730**, **1735**, **1740**, **1745** and **1750** may be as described above with reference to blocks **1505**, **1510**, **1515**, **1520**, **1525**, **1530**, **1535**, **1540**, **1545** and **1550** of FIG. **15**. However, in this example the cost function **1720** and the non-linear optimization method **1735** are modified, with respect to the cost function **1520** and the non-linear optimization method **1535** of FIG. **15**, so as to operate on both DOA data and TOA data. The TOA data of block **1708** may, in some examples, be obtained as described above with reference to FIG. **16**. Another difference, as compared to the process of FIG. **15**, is that in this example the non-linear optimization method **1735** also outputs recording and playback latency data **1747** corresponding to the smart audio devices, e.g., as described below. Accordingly, in some implementations, the results evaluation block **1750** may involve evaluating both DOA data and/or TOA data. In some such examples, the operations of block **1750** may include a feedback process involving the DOA data and/or TOA data. For example, some such examples

may implement a feedback process that involves comparing the residual of a given TOA/DOA candidate combination with another TOA/DOA candidate combination, e.g., as explained in the TOA/DOA robustness measures discussion below.

(186) In some examples, results evaluation block **1750** involves computing the residual of the cost function at the outcome position and orientations. A relatively lower residual normally indicates relatively more precise device localization values. According to some implementations, the results evaluation block **1750** may involve a feedback process. For example, some such examples may implement a feedback process that involves comparing the residual of a given TOA/DOA candidate combination with another TOA/DOA candidate combination, e.g., as explained in the TOA and DOA robustness measures discussion below.

(187) Accordingly, FIG. **16** includes dashed lines from block **630** (which may involve results evaluation in some examples) to DOA candidate selection block **1620** and TOA candidate selection block **1618**, to represent a flow of an optional feedback process. In some implementations block **1705** may involve obtaining acoustic DOA data as described above with reference to blocks **1605-1620** of FIG. **16**, which involve determining DOA candidates and selecting DOA candidates. In some examples block **1708** may involve obtaining acoustic TOA data as described above with reference to blocks **1605-1618** of FIG. **16**, which involve determining TOA candidates and selecting TOA candidates. Although not shown in FIG. **17**, some optional feedback processes may involve reverting from the results evaluation block **1750** to block **1705** and/or block **1708**.

(188) According to this example, the localization algorithm proceeds by minimizing a cost function, possibly subject to some constraints, and can be described as follows. In this example, the localization algorithm receives as input the DOA data **1705** and the TOA data **1708**, along with configuration parameters **1710** specified for the listening environment and possibly some optional constraints **1725**. In this example, the cost function takes into account the differences between the measured DOA and the estimated DOA, and the differences between the measured TOA and the estimated TOA. In some embodiments, the constraints **1725** impose restrictions on the possible device location, orientation, and/or latencies, such as imposing a condition that audio devices are a minimum distance from each other and/or imposing a condition that some device latencies should be zero.

(189) In some implementations, the cost function can be formulated as follows:
$C(x,z,$ ⬚custom character$,k)=W$.sub.DOAC.sub.DOA$(x,z)+W$.sub.TOAC.sub.TOA$(x,$ ⬚custom character$,k)$

(190) In the foregoing equation, ⬚custom character$=($ ⬚custom character.sub.1, . . . , ⬚custom character.sub.N) and $k=(k$.sub.1, . . . , k.sub.N) are represent vectors of playback and recording devices for every device, respectively, and where W.sub.DOA and W.sub.TOA represent the global weights (also known as prefactors) of the DOA and TOA minimization parts, respectively, reflecting the relative importance of each one of the two terms. In some such examples, the TOA cost function can be formulated as:

$$(191)\ C_{\text{TOA}}(x,,k) = \sum_{n=1}^{N} \sum_{m=1}^{N} w_{nm}^{\text{TOA}} \left(c\text{TOA}_{nm} - c\ell_m + ck_n - \| x_m - x_n \| \right)^2,$$

where TOA.sub.nm represents the measured time of arrival of signal travelling from smart device m to smart device n; w.sub.nm.sup.TOA represents the weight given to the TOA.sub.nm measurement; and c represents the speed of sound.

(192) There are up to 5 real unknowns per every smart audio device: the device positions x.sub.n (2 real unknowns per device), the device orientations α.sub.n (1 real unknown per device) and the recording and playback latencies ⬚custom character.sub.n and k.sub.n (2 additional unknowns per device). From these, only device positions and latencies are relevant for the TOA part of the cost function. The number of effective unknowns can be reduced in some implementations if there are a priori known restrictions or links between the latencies.

(193) In some examples, there may be additional prior information, e.g., regarding the availability

or reliability of each TOA measurement. In some of these examples, the weights w.sub.nm.sup.TOA can either be zero or one, e.g., zero for those measurements which are not available (or considered not sufficiently reliable) and one for the reliable measurements. This way, device localization may be estimated with only a subset of all possible DOA and/or TOA elements. In some other implementations, the weights may have a continuous value from zero to one, e.g., as a function of the reliability of the TOA measurement. In some examples, in which no prior reliability information is available, the weights may simply be set to one.

(194) According to some implementations, one or more additional constraints may be placed on the possible values of the latencies and/or the relation of the different latencies among themselves.

(195) In some examples, the position of the audio devices may be measured in standard units of length, such as meters, and the latencies and times of arrival may be indicated in standard units of time, such as seconds. However, it is often the case that non-linear optimization methods work better when the scale of variation of the different variables used in the minimization process is of the same order. Therefore, some implementations may involve rescaling the position measurements so that the range of variation of the smart device positions ranges between −1 and 1, and rescaling the latencies and times of arrival so that these values range between −1 and 1 as well.

(196) The minimization of the cost function above does not fully determine the absolute position and orientation of the smart audio devices or the latencies. The TOA information gives an absolute distance scale, meaning that the cost function is no longer invariant under a scale transformation, but still remains invariant under a global rotation and a global translation. Additionally, the latencies are subject to an additional global symmetry: the cost function remains invariant if the same global quantity is added simultaneously to all the playback and recording latencies. These global transformations cannot be determined from the minimization of the cost function. Similarly, the configuration parameters should provide a criterion to allowing to uniquely define a device layout representing an entire equivalence class.

(197) In some examples, the symmetry disambiguation criteria may include the following: a reference position, fixing the global translation symmetry (e.g., smart device **1** should be at the origin of coordinates); a reference orientation, fixing the two-dimensional rotation symmetry (e.g., smart device **1** should be oriented toward the front); and a reference latency (e.g., recording latency for device **1** should be zero). In total, in this example there are 4 parameters that cannot be determined from the minimization problem and that should be provided as an external input. Therefore, there are 5N−4 unknowns that can be determined from the minimization problem.

(198) In some implementations, besides the set of smart audio devices, there may be one or more passive audio receivers, which may not be equipped with a functioning microphone array, and/or one or more audio emitters. The inclusion of latencies as minimization variables allows some disclosed methods to localize receivers and emitters for which emission and reception times are not precisely known. In some such implementations, the TOA cost function described above may be implemented. This cost function is shown again below for the reader's convenience:

(199) $0C_{\text{TOA}}(x,,k) = \sum_{n=1}^{N} \sum_{m=1}^{N} w_{nm}^{\text{TOA}} (c\text{TOA}_{nm} - c\ell_m + ck_n - \lVert x_m - x_n \rVert)^2$

(200) As described above with reference to the DOA cost function, the cost function variables need to be interpreted in a slightly different way if the cost function is used for localization estimates involving passive receivers and/or emitters. Now N represents the total number of devices, including N.sub.smart smart audio devices, N.sub.rec passive audio receivers and N.sub.emit emitters, so that N=N.sub.smart+N.sub.rec+N.sub.emit. The weights w.sub.nm.sup.DOA may have a sparse structure to mask out missing data due to passive receivers or emitters-only, e.g., so that w.sub.nm.sup.DOA=0 for all m if device n is an audio emitter, and w.sub.nm.sup.DOA=0 for all n if device m is an audio receiver. According to some implementations, for smart audio devices positions, orientations, and recording and playback latencies must be determined; for passive receivers, positions, orientations, and recording latencies must be determined; and for audio

emitters, positions and playback latencies must be determined. According to some such examples, the total number of unknowns is therefore $5N_{smart}+4N_{rec}+3N_{emit}-4$.

(201) Disambiguation of Global Translation and Rotation

(202) Solutions to both DOA-only and combined TOA and DOA problems are subject to a global translation and rotation ambiguity. In some examples, the translation ambiguity can be resolved by treating an emitter-only source as a listener and translating all devices such that the listener lies at the origin.

(203) Rotation ambiguities can be resolved by placing additional constraints on the solution. For example, some multi-loudspeaker environments may include television (TV) loudspeakers and a couch positioned for TV viewing. After locating the loudspeakers in the environment, some methods may involve finding a vector joining the listener to the TV viewing direction. Some such methods may then involve having the TV emit a sound from its loudspeakers and/or prompting the user to walk up to the TV and locating the user's speech. Some implementations may involve rendering an audio object that pans around the environment. A user may provide user input (e.g., saying "Stop") indicating when the audio object is in one or more predetermined positions within the environment, such as the front of the environment, at a TV location of the environment, etc. Some implementations involve a cellphone app equipped with an inertial measurement unit that prompts the user to point the cellphone in two defined directions: the first in the direction of a particular device, for example the device with lit LEDs, the second in the user's desired viewing direction, such as the front of the environment, at a TV location of the environment, etc. Some detailed disambiguation examples will now be described with reference to FIGS. **18**A-**18**D.

(204) FIG. **18**A shows an example of an audio environment. According to some examples, the audio device location data output by one of the disclosed localization methods may include an estimate of an audio device location for each of audio devices **1**-**5**, with reference to the audio device coordinate system **1807**. In this implementation, the audio device coordinate system **1807** is a Cartesian coordinate system having the location of the microphone of audio device **2** as its origin. Here, the x axis of the audio device coordinate system **1807** corresponds with a line **1803** between the location of the microphone of audio device **2** and the location of the microphone of audio device **1**.

(205) In this example, this example, the listener location is determined by prompting the listener **1805** who is shown seated on the couch **1103** (e.g., via an audio prompt from one or more loudspeakers in the environment **1800***a*) to make one or more utterances **1827** and estimating the listener location according to time-of-arrival (TOA) data. The TOA data corresponds to microphone data obtained by a plurality of microphones in the environment. In this example, the microphone data corresponds with detections of the one or more utterances **1827** by the microphones of at least some (e.g., 3, 4 or all 5) of the audio devices **1**-**5**.

(206) Alternatively, or additionally, the listener location may be estimated according to DOA data provided by the microphones of at least some (e.g., 2, 3, 4 or all 5) of the audio devices **1**-**5**. According to some such examples, the listener location may be determined according to the intersection of lines **1809***a*, **1809***b*, etc., corresponding to the DOA data.

(207) According to this example, the listener location corresponds with the origin of the listener coordinate system **1820**. In this example, the listener angular orientation data is indicated by the y′ axis of the listener coordinate system **1820**, which corresponds with a line **1813***a* between the listener's head **1810** (and/or the listener's nose **1825**) and the sound bar **1830** of the television **1101**. In the example shown in FIG. **18**A, the line **1813***a* is parallel to the y′ axis. Therefore, the angle ⊖ represents the angle between the y axis and the y′ axis. Accordingly, although the origin of the audio device coordinate system **1807** is shown to correspond with audio device **2** in FIG. **18**A, some implementations involve co-locating the origin of the audio device coordinate system **1807** with the origin of the listener coordinate system **1820** prior to the rotation by the angle ⊖ of audio device coordinates around the origin of the listener coordinate system **1820**. This co-location may

be performed by a coordinate transformation from the audio device coordinate system **1807** to the listener coordinate system **1820**.

(208) The location of the sound bar **1830** and/or the television **1101** may, in some examples, be determined by causing the sound bar to emit a sound and estimating the sound bar's location according to DOA and/or TOA data, which may correspond detections of the sound by the microphones of at least some (e.g., 3, 4 or all 5) of the audio devices **1**-**5**. Alternatively, or additionally, the location of the sound bar **1830** and/or the television **1101** may be determined by prompting the user to walk up to the TV and locating the user's speech by DOA and/or TOA data, which may correspond detections of the sound by the microphones of at least some (e.g., 3, 4 or all 5) of the audio devices **1**-**5**. Some such methods may involve applying a cost function, e.g., as described above. Some such methods may involve triangulation. Such examples may be beneficial in situations wherein the sound bar **1830** and/or the television **1101** has no associated microphone.

(209) In some other examples wherein the sound bar **1830** and/or the television **1101** does have an associated microphone, the location of the sound bar **1830** and/or the television **1101** may be determined according to TOA and/or DOA methods, such as the methods disclosed herein. According to some such methods, the microphone may be co-located with the sound bar **1830**.

(210) According to some implementations, the sound bar **1830** and/or the television **1101** may have an associated camera **1811**. A control system may be configured to capture an image of the listener's head **1810** (and/or the listener's nose **1825**). In some such examples, the control system may be configured to determine a line **1813**a between the listener's head **1810** (and/or the listener's nose **1825**) and the camera **1811**. The listener angular orientation data may correspond with the line **1813**a. Alternatively, or additionally, the control system may be configured to determine an angle $\ominus$ between the line **1813**a and the y axis of the audio device coordinate system.

(211) FIG. **18**B shows an additional example of determining listener angular orientation data. According to this example, the listener location has already been determined. Here, a control system is controlling loudspeakers of the environment **1800**b to render the audio object **1835** to a variety of locations within the environment **1800**b. In some such examples, the control system may cause the loudspeakers to render the audio object **1835** such that the audio object **1835** seems to rotate around the listener **1805**, e.g., by rendering the audio object **1835** such that the audio object **1835** seems to rotate around the origin of the listener coordinate system **1820**. In this example, the curved arrow **1840** shows a portion of the trajectory of the audio object **1835** as it rotates around the listener **1805**.

(212) According to some such examples, the listener **1805** may provide user input (e.g., saying "Stop") indicating when the audio object **1835** is in the direction that the listener **1805** is facing. In some such examples, the control system may be configured to determine a line **1813**b between the listener location and the location of the audio object **1835**. In this example, the line **1813**b corresponds with the y′ axis of the listener coordinate system, which indicates the direction that the listener **1805** is facing. In alternative implementations, the listener **1805** may provide user input indicating when the audio object **1835** is in the front of the environment, at a TV location of the environment, at an audio device location, etc.

(213) FIG. **18**C shows an additional example of determining listener angular orientation data. According to this example, the listener location has already been determined. Here, the listener **1805** is using a handheld device **1845** to provide input regarding a viewing direction of the listener **1805**, by pointing the handheld device **1845** towards the television **1101** or the soundbar **1830**. The dashed outline of the handheld device **1845** and the listener's arm indicate that at a time prior to the time at which the listener **1805** was pointing the handheld device **1845** towards the television **1101** or the soundbar **1830**, the listener **1805** was pointing the handheld device **1845** towards audio device **2** in this example. In other examples, the listener **1805** may have pointed the handheld device **1845** towards another audio device, such as audio device **1**. According to this example, the handheld device **1845** is configured to determine an angle α between audio device **2** and the

television **1101** or the soundbar **1830**, which approximates the angle between audio device **2** and the viewing direction of the listener **1805**.

(214) The handheld device **1845** may, in some examples, be a cellular telephone that includes an inertial sensor system and a wireless interface configured for communicating with a control system that is controlling the audio devices of the environment **1800***c*. In some examples, the handheld device **1845** may be running an application or "app" that is configured to control the handheld device **1845** to perform the necessary functionality, e.g., by providing user prompts (e.g., via a graphical user interface), by receiving input indicating that the handheld device **1845** is pointing in a desired direction, by saving the corresponding inertial sensor data and/or transmitting the corresponding inertial sensor data to the control system that is controlling the audio devices of the environment **1800***c*, etc.

(215) According to this example, a control system (which may be a control system of the handheld device **1845**, a control system of a smart audio device of the environment **1800***c* or a control system that is controlling the audio devices of the environment **1800***c*) is configured to determine the orientation of lines **1813***c* and **1850** according to the inertial sensor data, e.g., according to gyroscope data. In this example, the line **1813***c* is parallel to the axis y′ and may be used to determine the listener angular orientation. According to some examples, a control system may determine an appropriate rotation for the audio device coordinates around the origin of the listener coordinate system **1820** according to the angle α between audio device **2** and the viewing direction of the listener **1805**.

(216) FIG. **18**D shows one example of determine an appropriate rotation for the audio device coordinates in accordance with the method described with reference to FIG. **18**C. In this example, the origin of the audio device coordinate system **1807** is co-located with the origin of the listener coordinate system **1820**. Co-locating the origins of the audio device coordinate system **1807** and the listener coordinate system **1820** is made possible after the listener location is determined. Co-locating the origins of the audio device coordinate system **1807** and the listener coordinate system **1820** may involve transforming the audio device locations from the audio device coordinate system **1807** to the listener coordinate system **1820**. The angle α has been determined as described above with reference to FIG. **18**C. Accordingly, the angle α corresponds with the desired orientation of the audio device **2** in the listener coordinate system **1820**. In this example, the angle β corresponds with the orientation of the audio device **2** in the audio device coordinate system **1807**. The angle ⊖, which is β-α in this example, indicates the necessary rotation to align the y axis of the of the audio device coordinate system **1807** with the y′ axis of the listener coordinate system **1820**.

(217) DOA Robustness Measures

(218) As noted above with reference to FIG. **14**, in some examples using "blind" methods that are applied to arbitrary signals including steered response power, beamforming, or other similar methods, robustness measures may be added to improve accuracy and stability. Some implementations include time integration of beamformer steered response to filter out transients and detect only the persistent peaks, as well as to average out random errors and fluctuations in those persistent DOAs. Other examples may use only limited frequency bands as input, which can be tuned to room or signal types for better performance.

(219) For examples using 'supervised' methods that involve the use of structured source signals and deconvolution methods to yield impulse responses, preprocessing measures can be implemented to enhance the accuracy and prominence of DOA peaks. In some examples, such preprocessing may include truncation with an amplitude window of some temporal width starting at the onset of the impulse response on each microphone channel. Such examples may incorporate an impulse response onset detector such that each channel onset can be found independently.

(220) In some examples based on either 'blind' or 'supervised' methods as described above, still further processing may be added to improve DOA accuracy. It is important to note that DOA selection based on peak detection (e.g., during Steered-Response Power (SRP) or impulse response

analysis) is sensitive to environmental acoustics that can give rise to the capture of non-primary path signals due to reflections and device occlusions that will dampen both receive and transmit energy. These occurrences can degrade the accuracy of device pair DOAs and introduce errors in the optimizer's localization solution. It is therefore prudent to regard all peaks within predetermined thresholds as candidates for ground truth DOAs. One example of a predetermined threshold is a requirement that a peak be larger than the mean Steered-Response Power (SRP). For all detected peaks, prominence thresholding and removing candidates below the mean signal level have proven to be simple yet effective initial filtering techniques. As used herein, "prominence" is a measure of how large a local peak is compared to its adjacent local minima, which is different from thresholding only based on power. One example of a prominence threshold is a requirement that the difference in power between a peak and its adjacent local minima be at or above a threshold value. Retention of viable candidates improves the chances that a device pair will contain a usable DOA in their set (within an acceptable error tolerance from the ground truth), though there is the chance that it will not contain a usable DOA in cases where the signal is corrupted by strong reflections/occlusions. In some examples, a selection algorithm may be implemented in order to do one of the following: 1) select the best usable DOA candidate per device pair; 2) make a determination that none of the candidates are usable and therefore null that pair's optimization contribution with the cost function weighting matrix; or 3) select a best inferred candidate but apply a non-binary weighting to the DOA contribution in cases where it is difficult to disambiguate the amount of error the best candidate carries.

(221) After an initial optimization with the best inferred candidates, in some examples the localization solution may be used to compute the residual cost contribution of each DOA. An outlier analysis of the residual costs can provide evidence of DOA pairs that are most heavily impacting the localization solution, with extreme outliers flagging those DOAs to be potentially incorrect or sub-optimal. A recursive run of optimizations for outlying DOA pairs based on the residual cost contributions with the remaining candidates and with a weighting applied to that device pair's contribution may then be used for candidate handling according to one of the aforementioned three options. This is one example of a feedback process such as described above with reference to FIGS. **14-17**. According to some implementations, repeated optimizations and handling decisions may be carried out until all detected candidates are evaluated and the residual cost contributions of the selected DOAs are balanced.

(222) A drawback of candidate selection based on optimizer evaluations is that it is computationally intensive and sensitive to candidate traversal order. An alternative technique with less computational weight involves determining all permutations of candidates in the set and running a triangle alignment method for device localization on these candidates. Relevant triangle alignment methods are disclosed in U.S. Provisional Patent Application No. 62/992,068, filed on Mar. 19, 2020 and entitled "Audio Device Auto-Location," which is hereby incorporated by reference for all purposes. The localization results can then be evaluated by computing the total and residual costs the results yield with respect to the DOA candidates used in the triangulation. Decision logic to parse these metrics can be used to determine the best candidates and their respective weighting to be supplied to the non-linear optimization problem. In cases where the list of candidates is large, therefore yielding high permutation counts, filtering and intelligent traversal through the permutation list may be applied.

(223) TOA Robustness Measures

(224) As described above with reference to FIG. **16**, the use of multiple candidate TOA solutions adds robustness over systems that utilize single or minimal TOA values, and ensures that errors have a minimal impact on finding the optimal speaker layout. Having obtained an impulse response of the system, in some examples each one of the TOA matrix elements can be recovered by searching for the peak corresponding to the direct sound. In ideal conditions (e.g., no noise, no obstructions in the direct path between source and receiver and speakers pointing directly to the

microphones) this peak can be easily identified as the largest peak in the impulse response. However, in presence of noise, obstructions, or misalignment of speakers and microphones, the peak corresponding to the direct sound does not necessarily correspond to the largest value. Moreover, in such conditions the peak corresponding to the direct sound can be difficult to isolate from other reflections and/or noise. The direct sound identification can, in some instances, be a challenging process. An incorrect identification of the direct sound will degrade (and in some instances may completely spoil) the automatic localization process. Thus, in cases wherein there is the potential for error in the direct sound identification process, it can be effective to consider multiple candidates for the direct sound. In some such instances, the peak selection process may include two parts: (1) a direct sound search algorithm, which looks for suitable peak candidates, and (2) a peak candidate evaluation process to increase the probability to pick the correct TOA matrix elements.

(225) In some implementations, the process of searching for direct sound candidate peaks may include a method to identify relevant candidates for the direct sound. Some such methods may be based on the following steps: (1) identify one first reference peak (e.g., the maximum of the absolute value of the impulse response (IR)), the "first peak;" (2) evaluate the level of noise around (before and after) this first peak; (3) search for alternative peaks before (and in some cases after) the first peak that are above the noise level; (4) rank the peaks found according to their probability of corresponding the correct TOA; and optionally (5) group close peaks (to reduce the number of candidates).

(226) Once direct sound candidate peaks are identified, some implementations may involve a multiple peak evaluation step. As a result of the direct sound candidate peak search, in some examples there will be one or more candidate values for each TOA matrix element ranked according their estimated probability. Multiple TOA matrices can be formed by selecting among the different candidate values. In order to assess the likelihood of a given TOA matrix, a minimization process (such as the minimization process described above) may be implemented. This process can generate the residuals of the minimization, which are a good estimates of the internal coherence of the TOA and DOA matrices. A perfect noiseless TOA matrix will lead to zero residuals, whereas a TOA matrix with incorrect matrix elements will lead to large residuals. In some implementations, the method will look for the set of candidate TOA matrix elements that creates the TOA matrix with the smallest residuals. This is one example of an evaluation process described above with reference to FIGS. **16** and **17**, which may involve results evaluation block **1750**. In one example, the evaluation process may involve performing the following steps: (1) choose an initial TOA matrix; (2) evaluate the initial matrix with the residuals of the minimization process; (3) change one matrix element of the TOA matrix from the list of TOA candidates; (4) re-evaluate the matrix with the residuals of the minimization process; (5) if the residuals are smaller accept the change, otherwise do not accept it; and (6) iterate over steps 3 to 5. In some examples, the evaluation process may stop when all TOA candidates have been evaluated or when a predefined maximum number of iterations has been reached.

(227) Localization Method Example

(228) FIG. **19** is a flow diagram that outlines one example of a localization method. The blocks of method **1900**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described. In this implementation, method **1900** involves estimating the locations and orientations of audio devices in an environment. The blocks of method **1900** may be performed by one or more devices, which may be (or may include) the apparatus **100** shown in FIG. **1**.

(229) In this example, block **1905** obtaining, by a control system, direction of arrival (DOA) data corresponding to sound emitted by at least a first smart audio device of the audio environment. The control system may, for example, be the control system **110** that is described above with reference to FIG. **1**. According to this example, the first smart audio device includes a first audio transmitter

and a first audio receiver and the DOA data corresponds to sound received by at least a second smart audio device of the audio environment. Here, the second smart audio device includes a second audio transmitter and a second audio receiver. In this example, the DOA data also corresponds to sound emitted by at least the second smart audio device and received by at least the first smart audio device. In some examples, the first and second smart audio devices may be two of the audio devices **1105***a*-**1105***d* shown in FIG. **11**.

(230) The DOA data may be obtained in various ways, depending on the particular implementation. In some instances, determining the DOA data may involve one or more of the DOA-related methods that are described above with reference to FIG. **14** and/or in the "DOA Robustness Measures" section. Some implementations may involve obtaining, by the control system, one or more elements of the DOA data using a beamforming method, a steered powered response method, a time difference of arrival method and/or a structured signal method.

(231) According to this example, block **1910** involves receiving, by the control system, configuration parameters. In this implementation, the configuration parameters correspond to the audio environment itself, to one or more audio devices of the audio environment, or to both the audio environment and the one or more audio devices of the audio environment. According to some examples, the configuration parameters may indicate a number of audio devices in the audio environment, one or more dimensions of the audio environment, one or more constraints on audio device location or orientation and/or disambiguation data for at least one of rotation, translation or scaling. In some examples, the configuration parameters may include playback latency data, recording latency data and/or data for disambiguating latency symmetry.

(232) In this example, block **1915** involves minimizing, by the control system, a cost function based at least in part on the DOA data and the configuration parameters, to estimate a position and an orientation of at least the first smart audio device and the second smart audio device.

(233) According to some examples, the DOA data also may correspond to sound emitted by third through N.sup.th smart audio devices of the audio environment, where N corresponds to a total number of smart audio devices of the audio environment. In such examples, the DOA data also may correspond to sound received by each of the first through N.sup.th smart audio devices from all other smart audio devices of the audio environment. In such instances, minimizing the cost function may involve estimating a position and an orientation of the third through N.sup.th smart audio devices.

(234) In some examples, the DOA data also may correspond to sound received by one or more passive audio receivers of the audio environment. Each of the one or more passive audio receivers may include a microphone array, but may lack an audio emitter. Minimizing the cost function may also provide an estimated location and orientation of each of the one or more passive audio receivers. According to some examples, the DOA data also may correspond to sound emitted by one or more audio emitters of the audio environment. Each of the one or more audio emitters may include at least one sound-emitting transducer but may lack a microphone array. Minimizing the cost function also may provide an estimated location of each of the one or more audio emitters.

(235) In some examples, method **1900** may involve receiving, by the control system, a seed layout for the cost function. The seed layout may, for example, specify a correct number of audio transmitters and receivers in the audio environment and an arbitrary location and orientation for each of the audio transmitters and receivers in the audio environment.

(236) According to some examples, method **1900** may involve receiving, by the control system, a weight factor associated with one or more elements of the DOA data. The weight factor may, for example, indicate the availability and/or the reliability of the one or more elements of the DOA data.

(237) In some examples, method **1900** may involve receiving, by the control system, time of arrival (TOA) data corresponding to sound emitted by at least one audio device of the audio environment and received by at least one other audio device of the audio environment. In some such examples,

the cost function may be based, at least in part, on the TOA data. Some such implementations may involve estimating at least one playback latency and/or at least one recording latency. According to some such examples, the cost function may operate with a rescaled position, a rescaled latency and/or a resealed time of arrival.

(238) In some examples, the cost function may include a first term depending on the DOA data only and second term depending on the TOA data only. In some such examples, the first term may include a first weight factor and the second term may include a second weight factor. According to some such examples, one or more TOA elements of the second term may have a TOA element weight factor indicating the availability or reliability of each of the one or more TOA elements.

(239) FIG. **20** is a flow diagram that outlines another example of a localization method. The blocks of method **2000**, like other methods described herein, are not necessarily performed in the order indicated. Moreover, such methods may include more or fewer blocks than shown and/or described. In this implementation, method **2000** involves estimating the locations and orientations of devices in an environment. The blocks of method **2000** may be performed by one or more devices, which may be (or may include) the apparatus **100** shown in FIG. **1**.

(240) In this example, block **2005** obtaining, by a control system, direction of arrival (DOA) data corresponding to transmissions of at least a first transceiver of a first device of the environment. The control system may, for example, be the control system **110** that is described above with reference to FIG. **1**. According to this example, the first transceiver includes a first transmitter and a first receiver and the DOA data corresponds to transmissions received by at least a second transceiver of a second device of the environment, the second transceiver also including a second transmitter and a second receiver. In this example, the DOA data also corresponds to transmissions from at least the second transceiver received by at least the first transceiver. According to some examples, the first transceiver and the second transceiver may be configured for transmitting and receiving electromagnetic waves. In some examples, the first and second smart audio devices may be two of the audio devices **1105***a*-**1105***d* shown in FIG. **11**.

(241) The DOA data may be obtained in various ways, depending on the particular implementation. In some instances, determining the DOA data may involve one or more of the DOA-related methods that are described above with reference to FIG. **14** and/or in the "DOA Robustness Measures" section. Some implementations may involve obtaining, by the control system, one or more elements of the DOA data using a beamforming method, a steered powered response method, a time difference of arrival method and/or a structured signal method.

(242) According to this example, block **2010** involves receiving, by the control system, configuration parameters. In this implementation, the configuration parameters correspond to the environment itself, to one or more devices of the audio environment, or to both the environment and the one or more devices of the audio environment. According to some examples, the configuration parameters may indicate a number of audio devices in the environment, one or more dimensions of the environment, one or more constraints on device location or orientation and/or disambiguation data for at least one of rotation, translation or scaling. In some examples, the configuration parameters may include playback latency data, recording latency data and/or data for disambiguating latency symmetry.

(243) In this example, block **2015** involves minimizing, by the control system, a cost function based at least in part on the DOA data and the configuration parameters, to estimate a position and an orientation of at least the first device and the second device.

(244) According to some implementations, the DOA data also may correspond to transmissions emitted by third through N.sup.th transceivers of third through N.sup.th devices of the environment, where N corresponds to a total number of transceivers of the environment and where the DOA data also corresponds to transmissions received by each of the first through N.sup.th transceivers from all other transceivers of the environment. In some such implementations, minimizing the cost function also may involve estimating a position and an orientation of the third

through N.sup.th transceivers.

(245) In some examples, the first device and the second device may be smart audio devices and the environment may be an audio environment. In some such examples, the first transmitter and the second transmitter may be audio transmitters. In some such examples, the first receiver and the second receiver may be audio receivers. According to some such examples, the DOA data also may correspond to sound emitted by third through N.sup.th smart audio devices of the audio environment, where N corresponds to a total number of smart audio devices of the audio environment. In such examples, the DOA data also may correspond to sound received by each of the first through N.sup.th smart audio devices from all other smart audio devices of the audio environment. In such instances, minimizing the cost function may involve estimating a position and an orientation of the third through N.sup.th smart audio devices. Alternatively, or additionally, in some examples the DOA data may correspond to electromagnetic waves emitted and received by devices in the environment.

(246) In some examples, the DOA data also may correspond to sound received by one or more passive receivers of the environment. Each of the one or more passive receivers may include a receiver array, but may lack a transmitter. Minimizing the cost function may also provide an estimated location and orientation of each of the one or more passive receivers. According to some examples, the DOA data also may correspond to transmissions from one or more transmitters of the environment. In some such examples, each of the one or more transmitters may lack a receiver array. Minimizing the cost function also may provide an estimated location of each of the one or more transmitters.

(247) In some examples, method **2000** may involve receiving, by the control system, a seed layout for the cost function. The seed layout may, for example, specify a correct number of transmitters and receivers in the audio environment and an arbitrary location and orientation for each of the transmitters and receivers in the audio environment.

(248) According to some examples, method **2000** may involve receiving, by the control system, a weight factor associated with one or more elements of the DOA data. The weight factor may, for example, indicate the availability and/or the reliability of the one or more elements of the DOA data.

(249) In some examples, method **2000** may involve receiving, by the control system, time of arrival (TOA) data corresponding to sound emitted by at least one audio device of the audio environment and received by at least one other audio device of the audio environment. In some such examples, the cost function may be based, at least in part, on the TOA data. Some such implementations may involve estimating at least one playback latency and/or at least one recording latency. According to some such examples, the cost function may operate with a rescaled position, a rescaled latency and/or a rescaled time of arrival.

(250) In some examples, the cost function may include a first term depending on the DOA data only and second term depending on the TOA data only. In some such examples, the first term may include a first weight factor and the second term may include a second weight factor. According to some such examples, one or more TOA elements of the second term may have a TOA element weight factor indicating the availability or reliability of each of the one or more TOA elements.

(251) FIG. **21**A shows an example of an audio environment. As with other figures provided herein, the types and numbers of elements shown in FIG. **21**A are merely provided by way of example. Other implementations may include more, fewer and/or different types and numbers of elements.

(252) According to this example, the audio environment **2100** includes a main living space **2101**a and a room **2101**b that is adjacent to the main living space **2101**a. Here, a wall **2102** and a door **2111** separates the main living space **2101**a from the room **2101**b. In this example, the amount of acoustic separation between the main living space **2101**a and the room **2101**b depends on whether the door **2111** is open or closed, and if open, the degree to which the door **211** is open.

(253) At the time corresponding to FIG. **21**A, a smart television (TV) **2103**a is located within the

audio environment **2100**. According to this example, the smart TV **2103***a* includes a left loudspeaker **2103***b* and a right loudspeaker **2103***c*.

(254) In this example, smart audio devices **2104**, **2105**, **2106**, **2107**, **2108** and **2109** are also located within the audio environment **2100** at the time corresponding to FIG. **21**A. According to this example, each of the smart audio devices **2104-2109** includes at least one microphone and at least one loudspeaker. However, in this instance the smart audio devices **2104-2109** include loudspeakers of various sizes and having various capabilities.

(255) According to this example, at least one acoustic event is occurring in the audio environment **2100**. In this example, one acoustic event is caused by the talking person **1210**, who is uttering a voice command **2112**.

(256) In this example, another acoustic event is caused, at least in part, by the variable element **2103**. Here, the variable element **2103** is a door of the audio environment **2100**. According to this example, as the door **2103** opens, sounds **2105** from outside the environment may be perceived more clearly inside the audio environment **2100**. Moreover, the changing angle of the door **2103** changes some of the echo paths within the audio environment **2100**. According to this example, element **2104** represents a variable element of the impulse response of the audio environment **2100** caused by varying positions of the door **2103**.

(257) Forced Gap Examples

(258) As noted above, in some implementations one or more "gaps" (also referred to herein as "forced gaps" or "parameterized forced gaps") may be inserted in one or more frequency ranges of audio playback signals of a content stream to produce modified audio playback signals. The modified audio playback signals may be reproduced or "played back" in the audio environment. In some such implementations, N gaps may be inserted into N frequency ranges of the audio playback signals during N time intervals. According to some such implementations, M audio devices may orchestrate their gaps in time and frequency, thereby allowing an accurate detection of the far-field (respective to each device) in the gap frequencies and time intervals.

(259) In some examples, a sequence of forced gaps is inserted in a playback signal, each forced gap in a different frequency band (or set of bands) of the playback signal, to allow a pervasive listener to monitor non-playback sound which occurs "in" each forced gap in the sense that it occurs during the time interval in which the gap occurs and in the frequency band(s) in which the gap is inserted. FIG. **21**B is an example of a spectrogram of modified audio playback signal. In this example, the modified audio playback signal was created by inserting gaps into an audio playback signal according to one example. More specifically, to generate the spectrogram of FIG. **21**B, a disclosed method was performed on an audio playback signal to introduce forced gaps (e.g., gaps G**1**, G**2**, and G**3** shown in FIG. **21**B) in frequency bands thereof, thereby generating the modified audio playback signal. In the spectrogram shown in FIG. **21**B, position along the horizontal axis indicates time and position along the vertical axis indicates frequency of the content of the modified audio playback signal at an instant of time. The density of dots in each small region (each such region centered at a point having a vertical and horizontal coordinate in this example) indicates energy of the content of the modified audio playback signal at the corresponding frequency and instant of time: denser regions indicate content having greater energy and less dense regions indicate content having lower energy. Thus, the gap G**1** occurs at a time (in other words, during a time interval) earlier than the time at which (in other words, during a time interval in which) gap G**2** or G**3** occurs, and gap G**1** has been inserted in a higher frequency band than the frequency band in which gap G**2** or G**3** has been inserted.

(260) Introduction of a forced gap into a playback signal in accordance some disclosed methods is distinct from simplex device operation in which a device pauses a playback stream of content (e.g., in order to better hear the user and the user's environment). Introduction of forced gaps into a playback signal in accordance with some disclosed methods may be optimized to significantly reduce (or eliminate) the perceptibility of artifacts resulting from the introduced gaps during

playback, preferably so that the forced gaps have no or minimal perceptible impact for the user, but so that the output signal of a microphone in the playback environment is indicative of the forced gaps (e.g., so the gaps can be exploited to implement a pervasive listening method). By using forced gaps which have been introduced in accordance with some disclosed methods, a pervasive listening system may monitor non-playback sound (e.g., sound indicative of background activity and/or noise in the playback environment) even without the use of an acoustic echo canceller.

(261) With reference to FIGS. **22**A and **22**B, we next describe an example of a parameterized forced gap which may be inserted in a frequency band of an audio playback signal, and criteria for selection of the parameters of such a forced gap. FIG. **22**A is a graph that shows an example of a gap in the frequency domain. FIG. **22**B is a graph that shows an example of a gap in the time domain. In these examples, the parameterized forced gap is an attenuation of playback content using a band attenuation, G, whose profiles over both time and frequency resemble the profiles shown in FIGS. **22**A and **22**B. Here, the gap is forced by applying attenuation G to a playback signal over a range ("band") of frequencies defined by a center frequency f.sub.0 (indicated in FIG. **22**A) and bandwidth B (also indicated in FIG. **22**A), with the attenuation varying as a function of time at each frequency in the frequency band (for example, in each frequency bin within the frequency band) with a profile resembling that shown in FIG. **22**B. The maximum value of the attenuation G (as a function of frequency across the band) may be controlled to increase from 0 dB (at the lowest frequency of the band) to a maximum attenuation (suppression depth) Z at the center frequency f.sub.0 (as indicated in FIG. **22**A), and to decrease (with increasing frequency above the center frequency) to 0 dB (at the highest frequency of the band).

(262) In this example, the graph of FIG. **22**A indicates a profile of the band attenuation G, as a function of frequency (i.e., frequency bin), applied to frequency components of an audio signal to force a gap in audio content of the signal in the band. The audio signal may be a playback signal (e.g., a channel of a multi-channel playback signal), and the audio content may be playback content.

(263) According to this example, the graph of FIG. **22**B shows a profile of the band attenuation G, as a function of time, applied to the frequency component at center frequency f.sub.0, to force the gap indicated in FIG. **22**A in audio content of the signal in the band. For each other frequency component in the band, the band gain as a function of time may have a similar profile to that shown in FIG. **22**B, but the suppression depth Z of FIG. **22**B may be replaced by an interpolated suppression depth kZ, where k is a factor which ranges from 0 to 1 (as a function of frequency) in this example, so that kZ has the profile shown in FIG. **22**A. In some examples, for each frequency component, the attenuation G may also be interpolated (e.g., as a function of time) from 0 dB to the suppression depth kZ (e.g., with k=1, as indicated in FIG. **22**B, at the center frequency), e.g., to reduce musical artifacts resulting from introduction of the gap. Three regions (time intervals), t**1**, t**2**, and t**3**, of this latter interpolation are shown in FIG. **22**B.

(264) Thus, when a gap forcing operation occurs for a particular frequency band (e.g., the band centered at center frequency, f.sub.0, shown in FIG. **22**A), in this example the attenuation G applied to each frequency component in the band (e.g., to each bin within the band) follows a trajectory as shown in FIG. **22**B. Starting at 0 dB, it drops to a depth −kZ dB in t1 seconds, remains there for t**2** seconds, and finally rises back to 0 dB in t3 seconds. In some implementations, the total time t**1**+t**2**+t**3** may be selected with consideration of the time-resolution of whatever frequency transform is being used to analyze the microphone feed, as well as a reasonable duration of time that is not too intrusive for the user. Some examples of t1, t2 and t3 for single-device implementations are shown in Table 2, below.

(265) Some disclosed methods involve inserting forced gaps in accordance with a predetermined, fixed banding structure that covers the full frequency spectrum of the audio playback signal, and includes B.sub.count bands (where B.sub.count is a number, e.g., B.sub.count=49). To force a gap in any of the bands, a band attenuation is applied in the band in such examples. Specifically, for the

jth band, an attenuation, Gj, may be applied over the frequency region defined by the band.

(266) Table 2, below, shows example values for parameters t1, t2, t3, the depth Z, for each band, and an example of the number of bands, B.sub.count, for single-device implementations.

(267) TABLE-US-00002 TABLE 2 Parameter Default Minimum Maximum Units Purpose B.sub.count 49 20 128 — Number of discrete groupings of frequency bins, referred to as "bands" Z −12 −12 −18 dB Maximum attenuation applied in the forced gap in a band. t1 8 5 15 Milliseconds Time to ramp gain down to −Z dB at the center frequency of a band once a forced gap is triggered. t2 80 40 120 Milliseconds Time to apply attenuation −Z dB after t1 seconds. t3 8 5 15 Milliseconds Time to ramp gain up to 0 dB after t1 + t2 elapses.

(268) In determining the number of bands and the width of each band, a trade-off exists between perceptual impact and usefulness of the gaps: narrower bands with gaps are better in that they typically have less perceptual impact, whereas wider bands with gaps are better for implementing noise estimation (and other pervasive listening methods) and reducing the time ("convergence" time) required to converge to a new noise estimate (or other value monitored by pervasive listening), in all frequency bands of a full frequency spectrum, e.g., in response to a change in background noise or playback environment status). If only a limited number of gaps can be forced at once, it will take a longer time to force gaps sequentially in a large number of small bands than to force gaps sequentially in a smaller number of larger bands, resulting in a relatively longer convergence time. Larger bands (with gaps) provide a lot of information about the background noise (or other value monitored by pervasive listening) at once, but generally have a larger perceptual impact.

(269) In early work by the present inventors, gaps were posed in a single-device context, where the echo impact is mainly (or entirely) nearfield. Nearfield echo is largely impacted by the direct path of audio from the speakers to the microphones. This property is true of almost all compact duplex audio devices, (such as smart audio devices) with the exceptions being devices with larger enclosures and significant acoustic decoupling. By introducing short, perceptually masked gaps in the playback, such as those shown in Table 2, an audio device may obtain glimpses of the acoustic space in which the audio device is deployed through the audio device's own echo.

(270) However, when other audio devices are also playing content in the same audio environment, the present inventors have discovered that the gaps of a single audio device become less useful due to far-field echo corruption. Far-field echo corruption frequently lowers the performance of the local echo cancellation, significantly worsening the overall system performance. Far-field echo corruption is difficult to remove for various reasons. One reason is that obtaining a reference signal may require increased network bandwidth and added complexity for additional delay estimation. Moreover, estimating the far-field impulse response is more difficult as noise conditions are increased and the response is longer (more reverberant and spread out in time). In addition, far-field echo corruption is usually correlated with the near-field echo and other far-field echo sources, further challenging the far-field impulse response estimation.

(271) The present inventors have discovered that if multiple audio devices in an audio environment orchestrate their gaps in time and frequency, a clearer perception of the far-field (relative to each audio device) may be obtained when the multiple audio devices reproduce the modified audio playback signals. The present inventors have also discovered that if a target audio device plays back unmodified audio playback signals when the multiple audio devices reproduce the modified audio playback signals, the relative audibility and position of the target device can be estimated from the perspective of each of the multiple audio devices, even whilst media content is being played.

(272) Moreover, and perhaps counter-intuitively, the present inventors have discovered that breaking the guidelines that were formerly used for single-device implementations (e.g., keeping the gaps open for a longer period of time than indicated in Table 2) leads to implementations suitable for multiple devices making co-operative measurements via orchestrated gaps.

(273) For example, in some orchestrated gap implementations, t2 may be longer than indicated in Table 2, in order to accommodate the various acoustic path lengths (acoustic delays) between multiple distributed devices in an audio environment, which may be on the order of meters (as opposed to a fixed microphone-speaker acoustic path length on a single device, which may be tens of centimeters apart at most). In some examples, the default t2 value may be, e.g., 25 milliseconds greater than the 80 millisecond value indicated in Table 2, in order to allow for up to 8 meters of separation between orchestrated audio devices. In some orchestrated gap implementations, the default t2 value may be longer than the 80 millisecond value indicated in Table 2 for another reason: in orchestrated gap implementations, t2 is preferably longer in order to accommodate timing mis-alignment of the orchestrated audio devices, in order to ensure that an adequate amount of time passes during which all orchestrated audio devices have reached the value of Z attenuation. In some examples, an additional 5 milliseconds may be added to the default value of t2 to accommodate timing mis-alignment. Therefore, in some orchestrated gap implementations, the default value of t2 may be 110 milliseconds, with a minimum value of 70 milliseconds and a maximum value of 150 milliseconds.

(274) In some orchestrated gap implementations, t1 and/or t3 also may be different from the values indicated in Table 2. In some examples, t1 and/or t3 may be adjusted as a result of a listener not being able to perceive the different times that the devices go into or come out of their attenuation period due to timing issues and physical distance discrepancies. At least in part because of spatial masking (resulting from multiple devices playing back audio from different locations), the ability of a listener to perceive the different times at which orchestrated audio devices go into or come out of their attenuation period would tend to be less than in a single-device scenario. Therefore, in some orchestrated gap implementations the minimum values of t1 and t3 may be reduced and the maximum values of t1 and t3 may be increased, as compared to the single-device examples shown in Table 2. According to some such examples, the minimum values of t1 and t3 may be reduced to 2, 3 or 4 milliseconds and the maximum values of t1 and t3 may be increased to 20, 25 or 30 milliseconds.

(275) Examples of Measurements Using Orchestrated Gaps

(276) FIG. **22**C shows an example of modified audio playback signals including orchestrated gaps for multiple audio devices of an audio environment. In this implementation, multiple smart devices of an audio environment orchestrate gaps in order to estimate the relative audibility of one another. In this example, one measurement session corresponding to one gap is made during a time interval, and the measurement session includes only the devices in the main living space **2100***a* of FIG. **21**A. According to this example, previous audibility data has shown that smart audio device **2109**, which is located in the room **2101***b*, has already been classified as barely audible to the other audio devices and has been placed in a separate zone.

(277) In the examples shown in FIG. **22**C, the orchestrated gaps are attenuations of playback content using a band attenuation G.sub.k, wherein k represents a center frequency of a frequency band being measured. The elements shown in FIG. **22**C are as follows: Graph **2203** is a plot of G.sub.k in dB for smart audio device **2103** of FIG. **21**A; Graph **2204** is a plot of G.sub.k in dB for smart audio device **2104** in FIG. **21**A; Graph **2205** is a plot of G.sub.k in dB for smart audio device **2105** in FIG. **21**A; Graph **2206** is a plot of G.sub.k in dB for smart audio device **2106** in FIG. **21**A; Graph **2207** is a plot of G.sub.k in dB for smart audio device **2107** in FIG. **21**A; Graph **2208** is a plot of G.sub.k in dB for smart audio device **2108** in FIG. **21**A; and Graph **2209** is a plot of G.sub.k in dB for smart audio device **2109** in FIG. **21**A.

(278) As used herein, the term "session" (also referred to herein as a "measurement session") refers to a time period during which measurements of a frequency range are performed. During a measurement session, a set of frequencies with associated bandwidths, as well as a set of participating audio devices, may be specified.

(279) One audio device may optionally be nominated as a "target" audio device for a measurement

session. If a target audio device is involved in the measurement session, according to some examples the target audio device will be permitted to ignore the forced gaps and will play unmodified audio playback signals during the measurement session. According to some such examples, the other participating audio devices will listen to the target device playback sound, including the target device playback sound in the frequency range being measured.

(280) As used herein, the term "audibility" refers to the degree to which a device can hear another device's speaker output. Some examples of audibility are provided below.

(281) According to the example shown in FIG. **22**C, at time t**1**, an orchestrating device initiates a measurement session with smart audio device **2103** being the target audio device, selecting one or more bin center frequencies to be measured, including a frequency k. The orchestrating device may, in some examples, be a smart audio device acting as the leader (e.g., determined as described below with reference to FIG. **4**) In other examples, the orchestrating device may be another orchestrating device, such as a smart home hub. This measurement session runs from time t1 until time t2. The other participating smart audio devices, smart audio devices **2104-2108**, will apply a gap in their output and will reproduce modified audio playback signals, whilst the smart audio device **2103** will play unmodified audio playback signals.

(282) The subset of smart audio devices of the audio environment **2100** that are reproducing modified audio playback signals including orchestrated gaps (smart audio devices **2104-2108**) is one example of what may be referred to as M audio devices. According to this example, the smart audio device **2109** will also play unmodified audio playback signals. Therefore, the smart audio device **2109** is not one of the M audio devices. However, because the smart audio device **2109** is not audible to the other the smart audio devices of the audio environment, the smart audio device **2109** is not a target audio device in this example, despite the fact that the smart audio device **2109** and the target audio device (the smart audio device **2103** in this example) will both play back unmodified audio playback signals.

(283) It is desirable that the orchestrated gaps should have a low perceptual impact (e.g., a negligible perceptual impact) to listeners in the audio environment during the measurement session. Therefore, in some examples gap parameters may be selected to minimize perceptual impact. Some examples are described below with reference to FIGS. **23**B-**3**J.

(284) During this time (the measurement session from time t1 until time t2), the smart audio devices **2104-2108** will receive reference audio bins from the target audio device (the smart audio device **2103**) for the time-frequency data for this measurement session. In this example, the reference audio bins correspond to playback signals that the smart audio device **2103** uses as a local reference for echo cancellation. The smart audio device **2103** has access to these reference audio bins for the purposes of audibility measurement as well as echo cancellation.

(285) According to this example, at time t2 the first measurement session ends and the orchestrating device initiates a new measurement session, this time choosing one or more bin center frequencies that do not include frequency k. In the example shown in FIG. **22**C, no gaps are applied for frequency k during the period t2 to t3, so the graphs show unity gain for all devices. In some such examples, the orchestrating device may cause a series of gaps to be inserted into each of a plurality of frequency ranges for a sequence of measurement sessions for bin center frequencies that do not include frequency k. For example, the orchestrating device may cause second through N.sup.th gaps to be inserted into second through N.sup.th frequency ranges of the audio playback signals during second through N.sup.th time intervals, for the purpose of second through N.sup.th subsequent measurement sessions while the smart audio device **2103** remains the target audio device.

(286) In some such examples, the orchestrating device may then select another target audio device, e.g., the smart audio device **2104**. The orchestrating device may instruct the smart audio device **2103** to be one of the M smart audio devices that are playing back modified audio playback signals with orchestrated gaps. The orchestrating device may instruct the new target audio device to

reproduce unmodified audio playback signals. According to some such examples, after the orchestrating device has caused N measurement sessions to take place for the new target audio device, the orchestrating device may select another target audio device. In some such examples, the orchestrating device may continue to cause measurement sessions to take place until measurement sessions have been performed for each of the participating audio devices in an audio environment.

(287) In the example shown in FIG. **22**C, a different type of measurement session takes place between times t3 and t4. According to this example, at time t3, in response to user input (e.g., a voice command to a smart audio device that is acting as the orchestrating device), the orchestrating device initiates a new session in order to fully calibrate the loudspeaker setup of the audio environment **2100**. In general, a user may be relatively more tolerant of orchestrated gaps that have a relatively higher perceptual impact during a "set-up" or "recalibration" measurement session such as takes place between times t3 and t4. Therefore, in this example a large contiguous set of frequencies are selected for measurement, including k. According to this example, the smart audio device **2106** is selected as the first target audio device during this measurement session. Accordingly, during the first phase of the measurement session from time t3 to t4, all of the smart audio devices aside from the smart audio device **2106** will apply gaps.

(288) Gap Bandwidth

(289) FIG. **23**A is a graph that shows examples of a filter response used for creating a gap and a filter response used to measure a frequency region of a microphone signal used during a measurement session. According to this example, the elements of FIG. **23**A are as follows: Element **2301** represents the magnitude response of the filter used to create the gap in the output signal; Element **2302** represents the magnitude response of the filter used to measure the frequency region corresponding to the gap caused by element **2301**; Elements **2303** and **2304** represent the −3 dB points of **2301**, at frequencies f**1** and f**2**; and Elements **2305** and **2306** represent the −3 dB points of **2302**, at frequencies f**3** and f**4**.

(290) The bandwidth of the gap response **2301** (BW_gap) may be found by taking the difference between the −3 dB points **2303** and **2304**: BW_gap=f**2**−f**1** and BW_measure (the bandwidth of the measurement response **2302**)=f**4**−f**3**.

(291) According to one example, the quality of the measurement may be expressed as follows:

(292) $\text{quality} = \frac{\text{BW}_{\text{gap}}}{\text{BW}_{\text{measure}}} = \frac{f_2 - f_1}{f_4 - f_3}$

(293) Because the bandwidth of the measurement response is usually fixed, one can adjust the quality of the measurement by increasing the bandwidth of the gap filter response (e.g., widen the bandwidth). However, the bandwidth of the introduced gap is proportional to its perceptibility. Therefore, the bandwidth of the gap filter response should generally be determined in view of both the quality of the measurement and the perceptibility of the gap. Some examples of quality values are shown in Table 3:

(294) TABLE-US-00003 TABLE 3 Parameter Default Minimum Maximum Units Purpose quality 2 1.5 3 — Measures the confidence measurements made through forced gaps

(295) Although Table 3 indicates "minimum" and "maximum" values, those values are only for this example. Other implementations may involve lower quality values than 1.5 and/or higher quality values than 3.

(296) Gap Allocation Strategies

(297) Gaps may be defined by the following: An underlying division of the frequency spectrum, with center frequencies and measurement bandwidths; An aggregation of these smallest measurement bandwidths in a structure referred to as "banding"; A duration in time, attenuation depth, and the inclusion of one or more contiguous frequencies that conform to the agreed upon division of the frequency spectrum; and Other temporal behavior such as ramping the attenuation depth at the beginning and end of a gap.

(298) According to some implementations, gaps may be selected according to a strategy that will

aim to measure and observe as much of the audible spectrum in as short as time as possible, whilst meeting the applicable perceptibility constraints.

(299) FIGS. **23**B, **23**C, **23**D, **23**E, **23**F, **23**G, **23**H, **23**I and **23**J are graphs that show examples of gap allocation strategies. In these examples, time is represented by distance along the horizontal axis and frequency is represented by distance along the vertical axis. These graphs provide examples to illustrate the patterns produced by various gap allocation strategies, and how long they take to measure the complete audio spectrum. In these examples, each orchestrated gap measurement session is 10 seconds in length. As with other disclosed implementations, these graphs are merely provided by way of example. Other implementations may include more, fewer and/or different types, numbers and/or sequences of elements. For example, in other implementations each orchestrated gap measurement session may be longer or shorter than 10 seconds. In these examples, unshaded regions **2310** of the time/frequency space represented in FIGS. **23**B-**23**J (which may be referred to herein as "tiles") represent a gap at the indicated time-frequency period (of 10 seconds). Moderately-shaded regions **2315** represent frequency tiles that have been measured at least once. Lightly-shaded regions **2320** have yet to be measured.

(300) Assuming the task at hand requires that the participating audio devices insert orchestrated gaps for "listening through to the room" (e.g., to evaluate the noise, echo, etc., in the audio environment), then the measurement session completion times will be as they are indicated in FIGS. **23**B-**23**J. If the task requires that each audio device is made the target in turn, and listened to by the other audio devices, then the times need to be multiplied by the number of audio devices participating in the process. For example, if each audio device is made the target in turn, the three minutes and twenty seconds (3 m20 s) shown as the measurement session completion time in FIG. **23**B would mean that a system of 7 audio devices would be completely mapped after 7*3 m20 s=23 m20 s. When cycling through frequencies/bands, and multiple gaps are forced at once, in these examples the gaps will be spaced as far apart in frequency as possible for efficiency when covering the spectrum.

(301) FIGS. **23**B and **23**C are graphs that show examples of sequences of orchestrated gaps according to one gap allocation strategy. In these examples, the gap allocation strategy involves gapping N entire frequency bands (each of the frequency bands including at least one frequency bin, and in most cases a plurality of frequency bins) at a time during each successive measurement session. In FIG. **23**B N=1 and in FIG. **23**C N=3, the latter of which means that example of FIG. **23**C involves inserting three gaps during the same time interval. In these examples, the banding structure used is a 20-band Mel spaced arrangement. According to some such examples, after all 20 frequency bands have been measured, the sequence may restart. Although 3 m20 s is a reasonable time to reach a full measurement, the gaps being punched in the critical audio region of 300 Hz-8 kHz are very wide, and much time is devoted to measuring outside this region. Because of the relatively wide gaps in the frequency range of 300 Hz-8 kHz, this particular strategy will be very perceptible to users.

(302) FIGS. **23**D and **23**E are graphs that show examples of sequences of orchestrated gaps according to another gap allocation strategy. In these examples, the gap allocation strategy involves modifying the banding structure shown in FIGS. **23**B and **23**C to map to the "optimized" frequency region of approximately 300 Hz to 8 kHz. The overall allocation strategy is otherwise unchanged from that represented by FIGS. **23**B and **23**C, though the sequence finishes slightly earlier as the 20th band is now ignored. The bandwidths of the gaps being forced here will still be perceptible. However, the benefit is a very rapid measurement of the optimized frequency region, especially if gaps are forced into multiple frequency bands at once.

(303) FIGS. **23**F, **23**G and **23**H are graphs that show examples of sequences of orchestrated gaps according to another gap allocation strategy. In these examples, the gap allocation strategy involves a "force bin gaps" approach, wherein gaps are forced into single frequency bins instead of over entire frequency bands. The horizontal lines in FIGS. **23**F, **23**G and **23**H delineate the banding

structure shown in FIGS. **23**D and **23**E. Changing from a gap allocation strategy involving 19 bands to a gap allocation strategy involving 170 bins significantly increases the time taken to measure the optimized spectrum, with a single measurement session now taking over 25 minutes to complete in the example shown in FIG. **23**F in which N=1.

(304) The major advantage of the gap allocation strategy represented by FIGS. **23**F, **23**G and **23**H is the significantly lowered perceptibility of the process. Choosing N=3 (as shown in FIG. **23**G) or N=5 will decrease the measurement session time of the FIG. **23**F example by 1/N as shown in the plots of FIGS. **23**F and **23**G, and the perceptibility is still manageable.

(305) However, there are still two significant drawbacks to the gap allocation strategy represented by FIGS. **23**F, **23**G and **23**H. One is that the logarithmic nature of the banding structure has been ignored: the bandwidth of gaps at higher frequencies are too conservative based on what is true of human perception. The other drawback is that sequentially stepping through frequencies will completely measure each band before moving onto the next band. Through the imputation of missing data, and the averaging through the banding process, algorithms can still function with some confidence even if a band has not been fully measured.

(306) FIGS. **23**I and **23**J are graphs that show examples of sequences of orchestrated gaps according to another gap allocation strategy. In these examples, the bandwidth of gaps increases with frequency, but at a more conservative rate than the underlying banding structure represented by the horizontal lines in FIGS. **23**I and **23**J. Increasing the bandwidth of gaps with frequency reduces the overall measurement session time without negatively impacting the perceptibility of the inserted gaps. A second improvement is that for each gap being forced, the gap allocation strategy represented by FIGS. **23**I and **23**J involves selecting frequency bins within successive frequency bands (this is more evident in FIG. **23**I). According to these examples, by remembering/keeping track of the previously measured bin within each band, the next successive bin within that band is measured when that band is revisited. This process does not affect the time taken to measure the complete spectrum, but rapidly reduces the time taken to measure at least a portion of each band at least once. The gap allocation strategy represented by FIGS. **23**I and **23**J also has a less discernible pattern and structure than the above-described gap allocation strategies, further lowering the perceptibility impact.

(307) FIGS. **24**, **25**A and **25**B are flow diagrams that show examples of how multiple audio devices coordinate measurement sessions according to some implementations. The blocks shown in FIGS. **24**-**25**B, like those of other methods described herein, are not necessarily performed in the order indicated. For example, in some implementations the operations of block **2401** of FIG. **24** may be performed prior to the operations of block **2400**. Moreover, such methods may include more or fewer blocks than shown and/or described.

(308) According to these examples, a smart audio device is the orchestrating device (which also may be referred to herein as the "leader") and only one device may be the orchestrating device at one time. In other examples, the orchestrating device may be what is referred to herein as a smart home hub. The orchestrating device may be an instance of the apparatus **100** that is described above with reference to FIG. **1**.

(309) FIG. **24** depicts blocks that are performed by all participating audio devices according this this example. In this example, block **2400** involves obtaining a list of all the other participating audio devices. According to some such examples, block **2400** may involve obtaining an indication of the acoustic zone, group, etc., of each participating audio device. The list of block **2400** may, for example, be created by aggregating information from the other audio devices via network packets: the other audio devices may, for example, broadcast their intention to participate in the measurement session. As audio devices are added and/or removed from the audio environment, the list of block **2400** may be updated. In some such examples, the list of block **2400** may be updated according to various heuristics in order to keep the list up to date regarding only the most important devices (e.g., the audio devices that are currently within the main living space **2101***a* of FIG. **21**A).

(310) In the example shown in FIG. **24**, the link **2404** indicates the passing of the list of block **2400** to block **2401**, the negotiate leadership process. This negotiation process of block **2401** may take different forms, depending on the particular implementation. In the simplest embodiments, an alphanumeric sort for the lowest or highest device ID code (or other unique device identifier) may determine the leader without multiple communication rounds between devices, assuming all the devices can implement the same scheme. In more complex implementations, devices may negotiate with one another to determine which device is most suitable to be leader. For instance, it may be convenient for the device that aggregates orchestrated information to also be the leader for the purposes of facilitating the measurement sessions. The device with the highest uptime, the device with the greatest computational ability and/or a device connected to the main power supply may be good candidates for leadership. In general, arranging for such a consensus across multiple devices is a challenging problem, but a problem that has many existing and satisfactory protocols and solutions (for instance, the Paxos protocol). It will be understood that many such protocols exist and would be suitable.

(311) All participating audio devices then go on to perform block **2403**, meaning that the link **2406** is an unconditional link in this example. Block **2403** is described below with reference to FIG. **25**B. If a device is the leader, it will perform block **2402**. In this example, the link **2405** involves a check for leadership. The leadership process is described below with reference to FIG. **25**A. The outputs from this leadership process, including but not limited to messages to the other audio devices, are indicated by link **2407** of FIG. **24**.

(312) FIG. **25**A shows examples of processes performed by the orchestrating device or leader. Block **501** involves selecting a target device to be measured and selecting a gap allocation strategy, e.g., the start and end times of the gaps to be used during the measurement session, and the gaps' locations and size in the frequency. In some examples, block **2501** may involve selecting time t1, t2 and/or t3, as described above with reference to FIG. **22**B. Different applications may motivate different strategies for the foregoing selections. For example, the target device to be measured may be selected in some examples in part based on a measurement of "urgency," e.g., favouring devices and frequency bands that have not been measured recently. In some instances, a particular target device may be more important to measure based on a specific application or use case. For instance, the position of speakers used for the "left" and "right" channels in a spatial presentation may be generally be important to measure.

(313) According to this example, after the orchestrating device has made the selections of block **2501**, the process of FIG. **25**A continues to block **2502**. In this example, block **2502** involves sending the information determined in block **2501** to the other participating audio devices. In some examples, block **2502** may involve sending the information to the other participating audio devices via wireless communication, e.g., over a local Wi-Fi network, via Bluetooth, etc. In some examples, block **2502** may involve sending the details of the gap allocation strategy to the other participating audio devices, e.g., the start and end times of the gaps to be used during the measurement session, and the gaps' locations and size in the frequency. In other examples, the other participating audio devices may have stored information regarding each of a plurality of gap allocation strategies. In some such examples, block **2502** may involve sending an indication of the stored gap allocation strategy to select, e.g., gap allocation strategy 1, gap allocation strategy 2, etc. In some examples, block **2502** may involve sending a "session begin" indication, e.g., as described below with reference to FIG. **25**B.

(314) According to this example, after the orchestrating device has performed block **2502**, the process of FIG. **25**A continues to block **2503**, wherein the orchestrating device waits for the current measurement session to end. In this example, in block **2503** the orchestrating device waits for confirmations that all of the other participating audio devices have ended their sessions.

(315) In this example, after the orchestrating device has received confirmations from all of the other participating audio devices in block **2503**, the process of FIG. **25**A continues to block **2500**,

wherein the orchestrating device is provided information about the measurement session. Such information may influence the selection and timing of future measurement sessions. In some embodiments, block **2500** involves accepting measurements that were obtained during the measurement session from all of the other participating audio devices. The type of received measurements may depend on the particular implementation. According to some examples, the received measurements may be, or may include, microphone signals. Alternatively, or additionally, in some examples the received measurements may be, or may include, audio data extracted from the microphone signals. In some implementations, the orchestrating device may perform (or cause to be performed) one or more operations on the measurements received. For example, the orchestrating device may estimate (or cause to be estimated) a target audio device audibility or a target audio device position based, at least in part, on the extracted audio data. Some implementations may involve estimating a far-field audio environment impulse response and/or audio environment noise based, at least in part, on the extracted audio data.

(316) In the example shown in FIG. **25**A, the process will revert to block **2501** after block **2500** is performed. In some such examples, the process will revert to block **2501** a predetermined period of time after block **2500** is performed. In some instances, the process may revert to block **2501** in response to user input.

(317) FIG. **25**B shows examples of processes performed by participating audio devices other than the orchestrating device. Here, block **2510** involves each of the other participating audio devices sending a transmission (e.g., a network packet) to the orchestrating device, signalling each device's intention to participate in one or more measurement sessions. In some embodiments, block **2510** also may involve sending the results of one or more previous measurement sessions to the leader.

(318) In this example, block **2515** follows block **2510**. According to this example, block **2515** involves waiting for notification that a new measurement session will begin, e.g., as indicated via a "session begin" packet.

(319) According to this example, block **2520** involves applying a gap allocation strategy according to information provided by the orchestrating device, e.g., along with a "session begin" packet that was awaited in block **2515**. In this example, block **2520** involves applying the gap allocation strategy to generate modified audio playback signals that will be played back by participating audio devices (except the target audio device, if any) during the measurement session. According to this example, block **2520** involves detect audio device playback sound via audio device microphones and generating corresponding microphone during the measurement session. As suggested by the link **2522**, in some instances block **2520** may be repeated until all measurement sessions indicated by the orchestrating device are complete (e.g., according to a "stop" indication (for example, a stop packet) received from the orchestrating device, or after a predetermined duration of time). In some instances, block **2520** may be repeated for each of a plurality of target audio devices.

(320) Finally, block **2525** involves ceasing to insert the gaps that were applied during the measurement session. In this example, after block **2525** the process of FIG. **25**B reverts back to block **2510**. In some such examples, the process will revert to block **2510** a predetermined period of time after block **2525** is performed. In some instances, the process may revert to block **2510** in response to user input.

(321) In some implementations, the frequency region, duration, and ordering of target devices in a set sequence may be determined by a simple algorithm based on unique device ID/names alone. For instance, the ordering of target devices may come in some agreed upon lexical/alphanumeric order, and the frequency and gap duration may be based on the present time of day, common to all devices. Such simplified embodiments have a lower system complexity but may not adapt with more dynamic needs of the system.

(322) Example Measurements on Microphone Signals Revealed Through Gaps

(323) Sub-band signals measured over the duration of an orchestrated gap measurement session correspond to the noise in the room, plus direct stimulus from the target device if one has been

nominated. In this section we show examples of acoustic properties and related information that be determined from these sub-band signals, for further use in mapping, calibration, noise suppression and/or echo attenuation applications.

(324) Ranging

(325) According to some examples, sub-band signals measured during an orchestrated gap measurement session may be used to estimate the approximate distance between audio devices, e.g., based on an estimated direct-to-reverb ratio. For example, the approximate distance may be estimated based on a $1/r^2$ law if the target audio device can advertise an output sound pressure level (SPL), and if the speaker-to-microphone distance of the measuring audio device is known.

(326) DoA

(327) In some examples, sub-band signals measured during an orchestrated gap measurement session may be used to estimate the direction of arrival (DoA) and/or time or arrival (ToA) of sounds emitted by (e.g., speech of) one or more people and/or one or more audio devices in an audio environment. In some such examples, an acoustic zone corresponding with a current location of the one or more people and/or the one or more audio devices may be estimated. Some examples are described below with reference to FIG. **8**A et seq.

(328) Audibility & Impulse Responses

(329) According to some examples (e.g., in implementations such as that shown in FIG. **6**), during a measurement session both a reference signal r and microphone signal m may be recorded and closely time-aligned over a period of P audio frames. We can denote:

$r(t) \in$ custom character$^n, m(t) \in$ custom character^n

(330) In the foregoing expression, custom character^n represents a complex number space of dimension (size) n, r(t) and m(t) represent complex vectors of length n, and n represents the number of complex frequency bins used for the given measurement session. Accordingly, m(t) represents subband domain microphone signals. We can also denote:

$t \in$ custom character$, 1 \leq t \leq P$

(331) In the foregoing expression, custom character represents the set of all integer numbers and t represents any integer number in the range of 1-P, inclusively.

(332) In this formulation, a classic channel identification problem may be solved, attempting to estimate a linear transfer function H that predicts the signal m from r. Existing solutions to this problem include adaptive finite impulse response (FIR) filters, offline (noncausal) Wiener filters, and many other statistical signal processing methods. The magnitude of the transfer function H may be termed audibility, a useful acoustic property that may in some applications be used to rank devices relevance to one another based on how "mutually-audible" they are. According to some examples, the magnitude of the transfer function H may be determined at a range of audio device playback levels in order to determine whether played-back audio data indicates audio device non-linearities, e.g., as described above.

(333) Some aspects of present disclosure include a system or device configured (e.g., programmed) to perform one or more examples of the disclosed methods, and a tangible computer readable medium (e.g., a disc) which stores code for implementing one or more examples of the disclosed methods or steps thereof. For example, some disclosed systems can be or include a programmable general purpose processor, digital signal processor, or microprocessor, programmed with software or firmware and/or otherwise configured to perform any of a variety of operations on data, including an embodiment of disclosed methods or steps thereof. Such a general purpose processor may be or include a computer system including an input device, a memory, and a processing subsystem that is programmed (and/or otherwise configured) to perform one or more examples of the disclosed methods (or steps thereof) in response to data asserted thereto.

(334) Some embodiments may be implemented as a configurable (e.g., programmable) digital signal processor (DSP) that is configured (e.g., programmed and otherwise configured) to perform required processing on audio signal(s), including performance of one or more examples of the

disclosed methods. Alternatively, embodiments of the disclosed systems (or elements thereof) may be implemented as a general purpose processor (e.g., a personal computer (PC) or other computer system or microprocessor, which may include an input device and a memory) which is programmed with software or firmware and/or otherwise configured to perform any of a variety of operations including one or more examples of the disclosed methods. Alternatively, elements of some embodiments of the inventive system are implemented as a general purpose processor or DSP configured (e.g., programmed) to perform one or more examples of the disclosed methods, and the system also includes other elements (e.g., one or more loudspeakers and/or one or more microphones). A general purpose processor configured to perform one or more examples of the disclosed methods may be coupled to an input device (e.g., a mouse and/or a keyboard), a memory, and a display device.

(335) Another aspect of present disclosure is a computer readable medium (for example, a disc or other tangible storage medium) which stores code for performing (e.g., coder executable to perform) one or more examples of the disclosed methods or steps thereof.

(336) While specific embodiments and applications have been described herein, it will be apparent to those of ordinary skill in the art that many variations on the embodiments and applications described herein are possible without departing from the scope described and claimed herein. It should be understood that while certain forms have been shown and described, the scope of the present disclosure is not to be limited to the specific embodiments described and shown or the specific methods described.

Claims

1. An audio processing method, comprising: causing, by a control system, a plurality of audio devices in an audio environment to reproduce audio data, each audio device of the plurality of audio devices including at least one loudspeaker and at least one microphone; determining, by the control system, audio device location data including an audio device location for each audio device of the plurality of audio devices; obtaining, by the control system, microphone data from each audio device of the plurality of audio devices, the microphone data corresponding, at least in part, to sound reproduced by loudspeakers of other audio devices in the audio environment; determining, by the control system, a mutual audibility for each audio device of the plurality of audio devices relative to each other audio device of the plurality of audio devices; determining, by the control system, a user location of a person in the audio environment; determining, by the control system, a user location audibility of each audio device of the plurality of audio devices at the user location; and controlling one or more aspects of audio device playback based, at least in part, on the user location audibility.

2. The method of claim 1, wherein determining the audio device location data involves an audio device auto-location process.

3. The method of claim 2, wherein the audio device auto-location process involves obtaining direction of arrival data for each audio device of the plurality of audio devices.

4. The method of claim 2, wherein the audio device auto-location process involves obtaining time of arrival data for each audio device of the plurality of audio devices.

5. The method of claim 1, wherein determining the user location is based, at least in part, on at least one of direction of arrival data or time of arrival data corresponding to one or more utterances of the person.

6. The method of claim 1, wherein the one or more aspects of audio device playback include one or more of leveling or equalization.

7. The method of claim 1, wherein determining the mutual audibility for each audio device involves determining a mutual audibility matrix.

8. The method of claim 7, wherein determining the mutual audibility matrix involves a process of

mapping decibels relative to full scale to decibels of sound pressure level.

9. The method of claim 7, wherein the mutual audibility matrix includes measured transfer functions between each audio device of the plurality of audio devices.

10. The method of claim 7, wherein the mutual audibility matrix includes values for each frequency band of a plurality of frequency bands.

11. The method of claim 7, further comprising determining an interpolated mutual audibility matrix by applying an interpolant to measured audibility data.

12. The method of claim 11, wherein determining the interpolated mutual audibility matrix involves applying a decay law model that is based in part on a distance decay constant.

13. The method of claim 12, wherein the distance decay constant includes at least one of a per-device parameter or an audio environment parameter.

14. The method of claim 12, wherein the decay law model is frequency band based.

15. The method of claim 12, further comprising estimating an output gain for each audio device of the plurality of audio devices according to values of the mutual audibility matrix and the decay law model.

16. The method of claim 15, wherein estimating the output gain for each audio device involves determining a least squares solution to a function of values of the mutual audibility matrix and the decay law model.

17. The method of claim 15, further comprising determining values for the interpolated mutual audibility matrix according to a function of the output gain for each audio device, the user location and each audio device location.

18. The method of claim 17, wherein the values for the interpolated mutual audibility matrix correspond to the user location audibility of each audio device.

19. An apparatus configured to perform the method of claim 1.

20. A system configured to perform the method of claim 1.

21. One or more non-transitory media having software stored thereon, the software including instructions for controlling one or more devices to perform the method of claim 1.