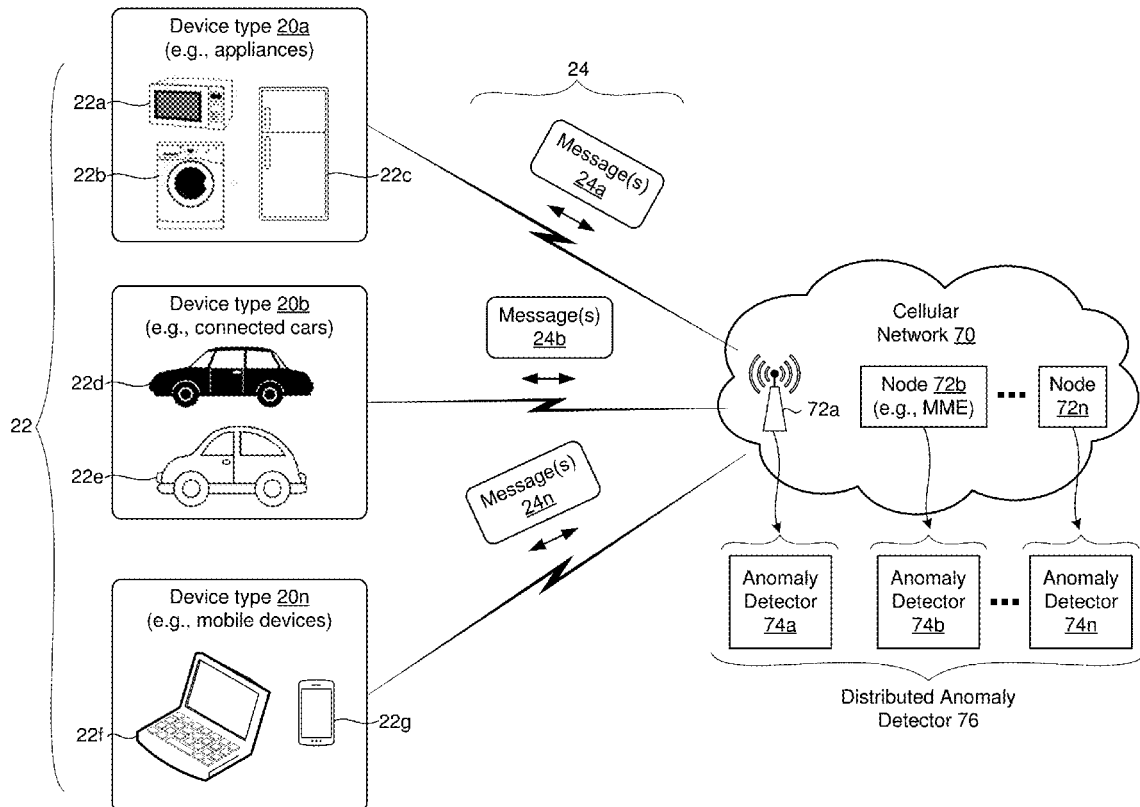


(19) **United States**(12) **Patent Application Publication**  
**Grayson et al.**(10) **Pub. No.: US 2019/0132341 A1**(43) **Pub. Date: May 2, 2019**(54) **IDENTIFYING ANOMALIES IN A NETWORK**(52) **U.S. Cl.**(71) Applicant: **Cisco Technology, Inc.**, San Jose, CA (US)CPC ..... *H04L 63/1425* (2013.01); *H04W 76/27* (2018.02); *H04W 24/00* (2013.01); *H04W 12/12* (2013.01)(72) Inventors: **Mark Grayson**, Berkshirem (GB);  
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(57)

**ABSTRACT**

Various implementations disclosed herein enable identifying anomalies in a network. For example, in various implementations, a method of identifying anomalies in a network is performed by a network node. In various implementations, the network node includes one or more processors, and a non-transitory memory. In various implementations, the method includes generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type. In various implementations, the method includes determining, based on communications associated with the first device, a performance indicator that indicates a performance of the first device. In various implementations, the method includes synthesizing an anomaly indicator as a function of the performance indicator in relation to the characteristic indicator.

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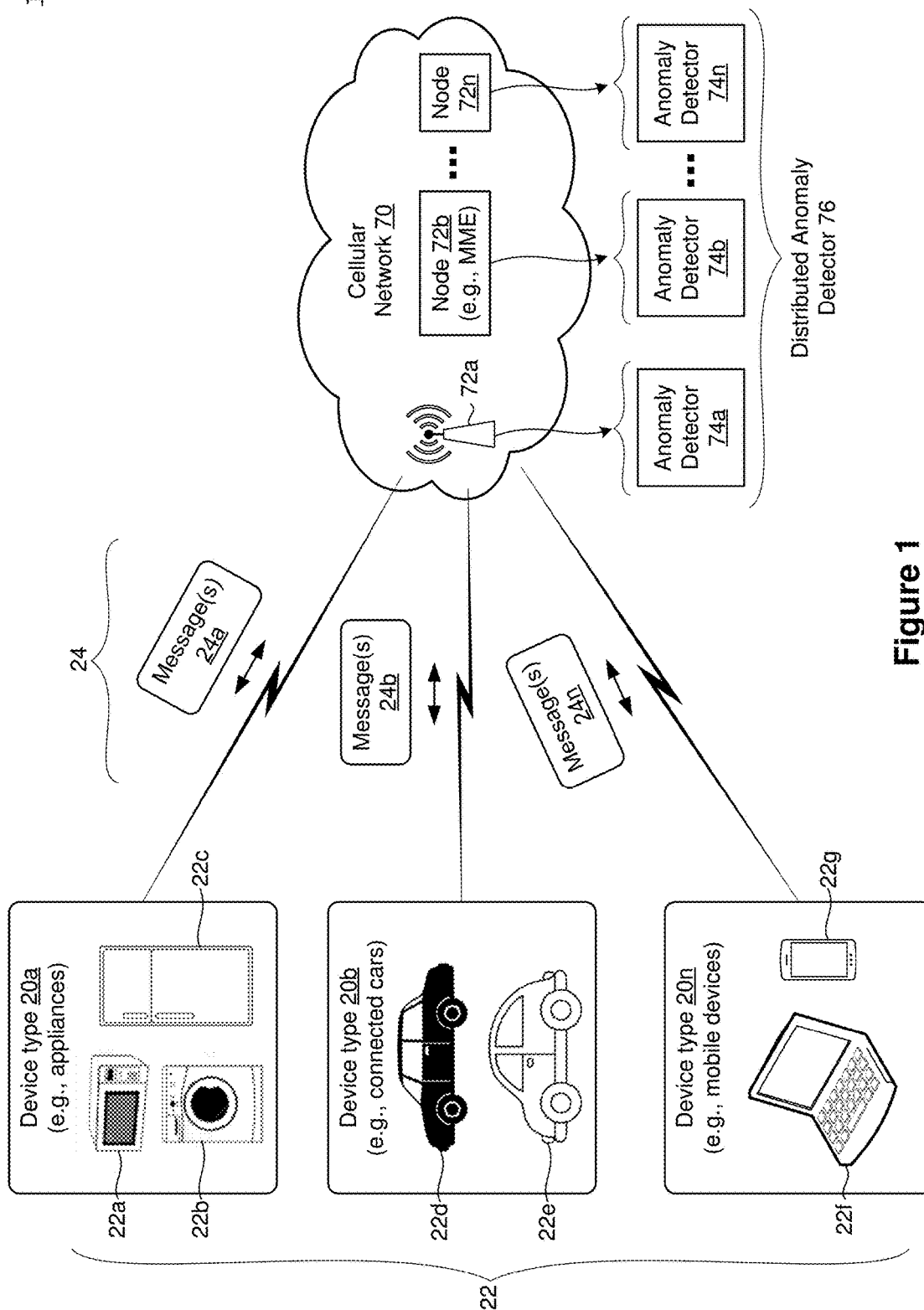


Figure 1

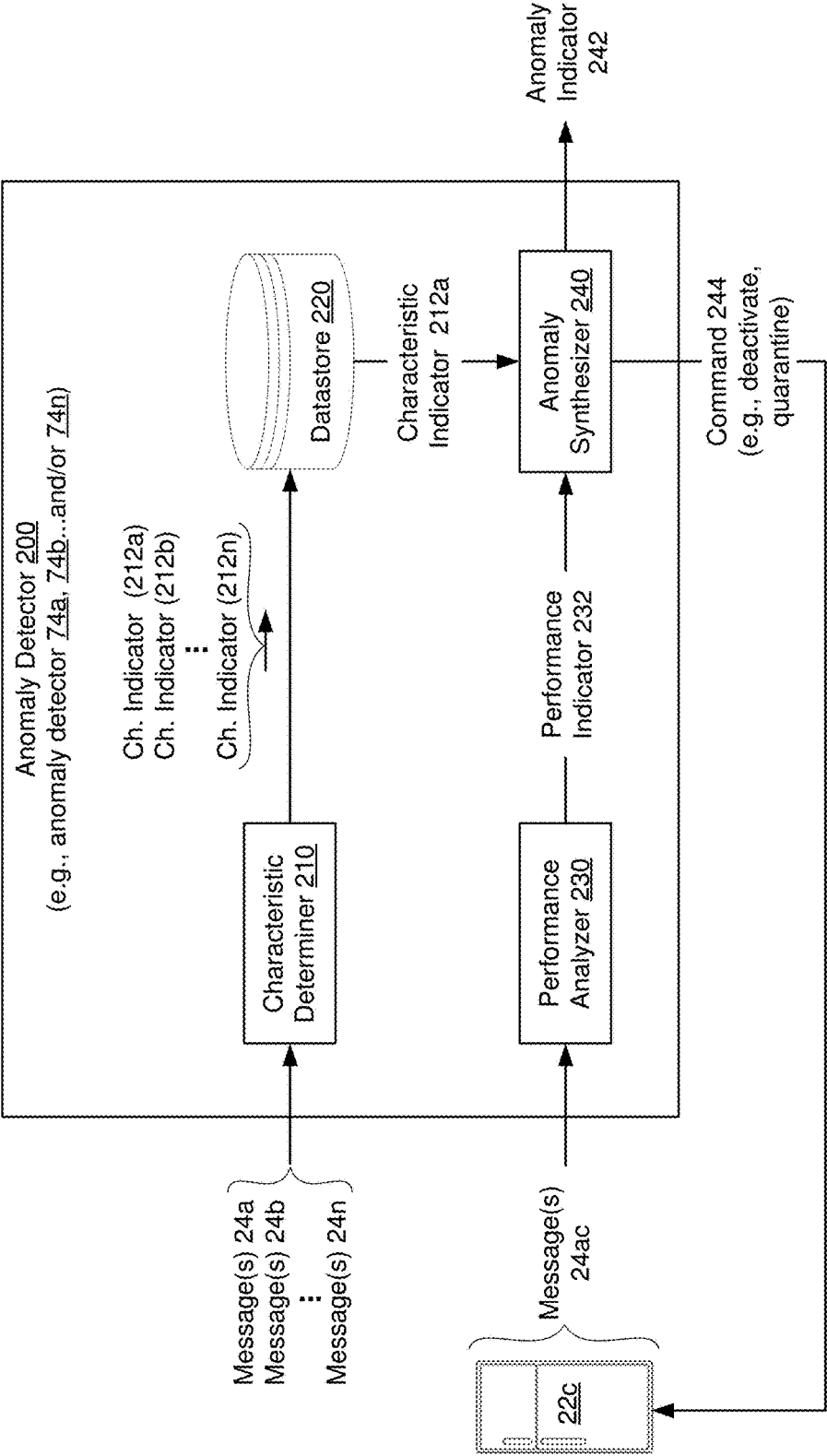


Figure 2

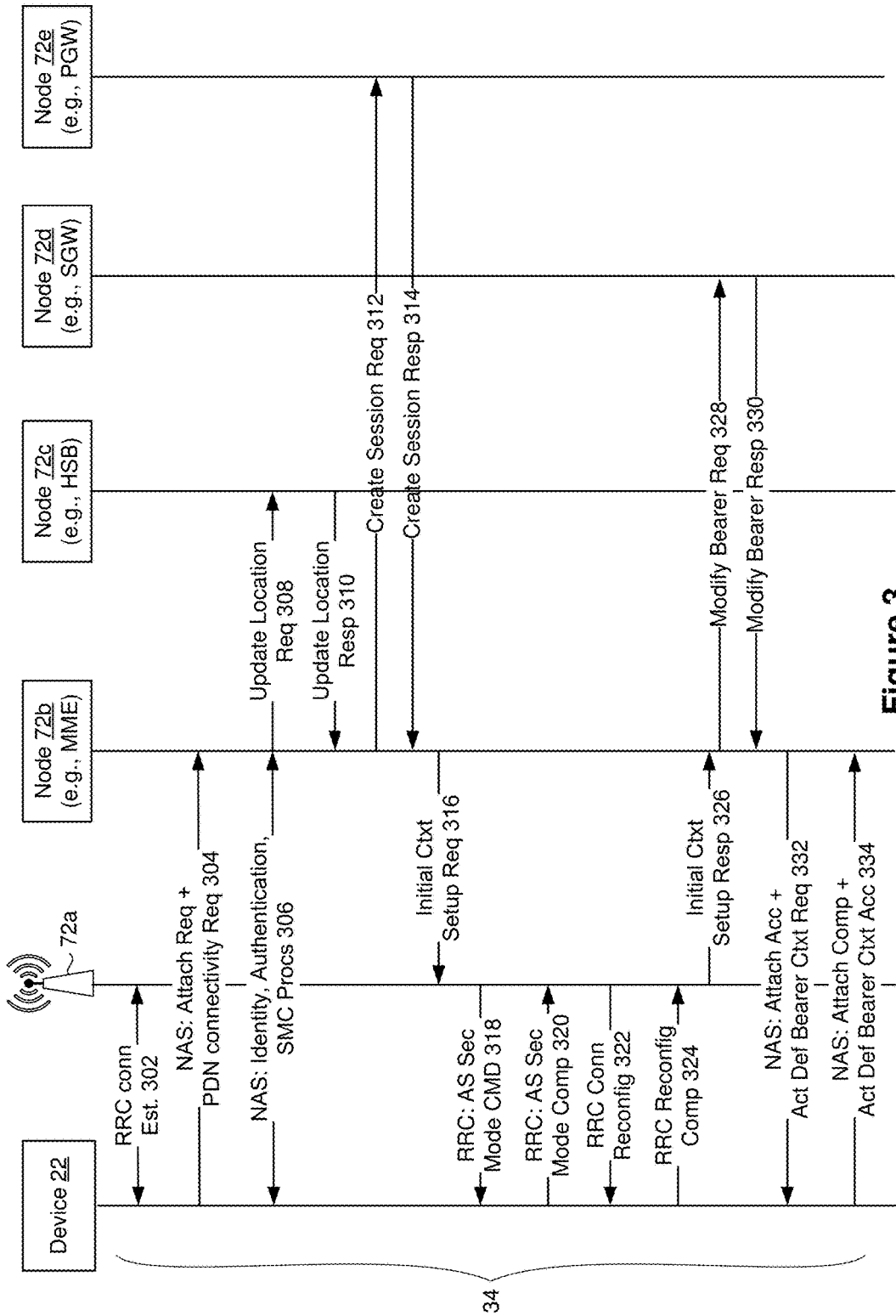


Figure 3

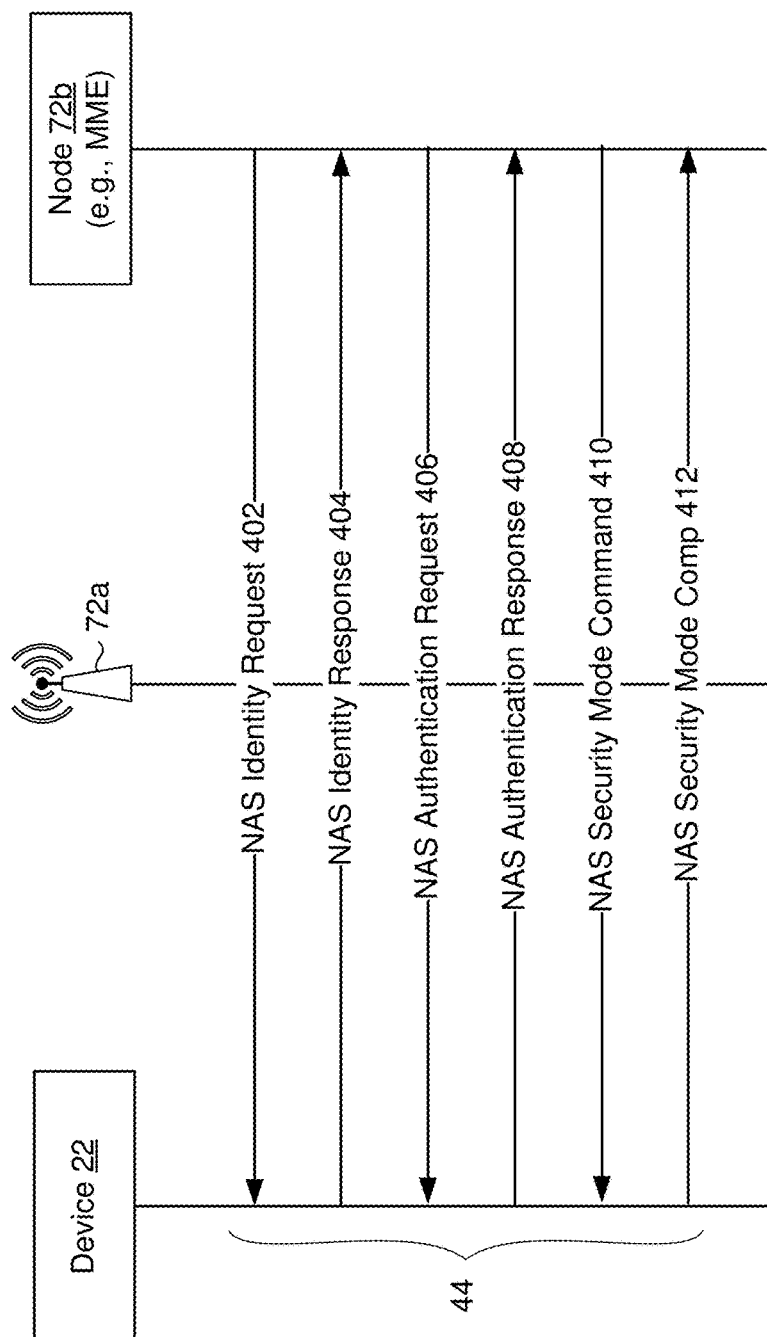
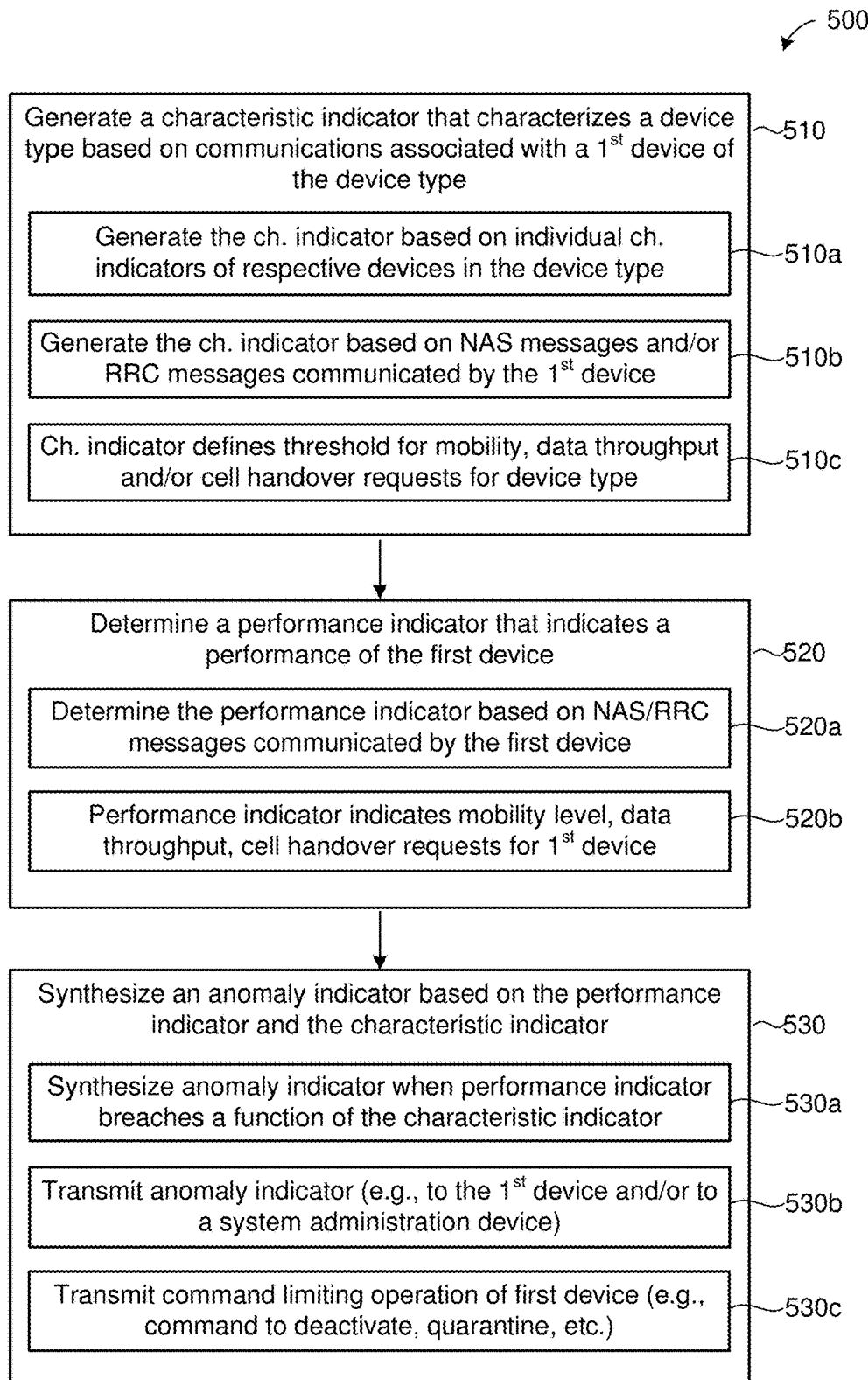


Figure 4

**Figure 5**

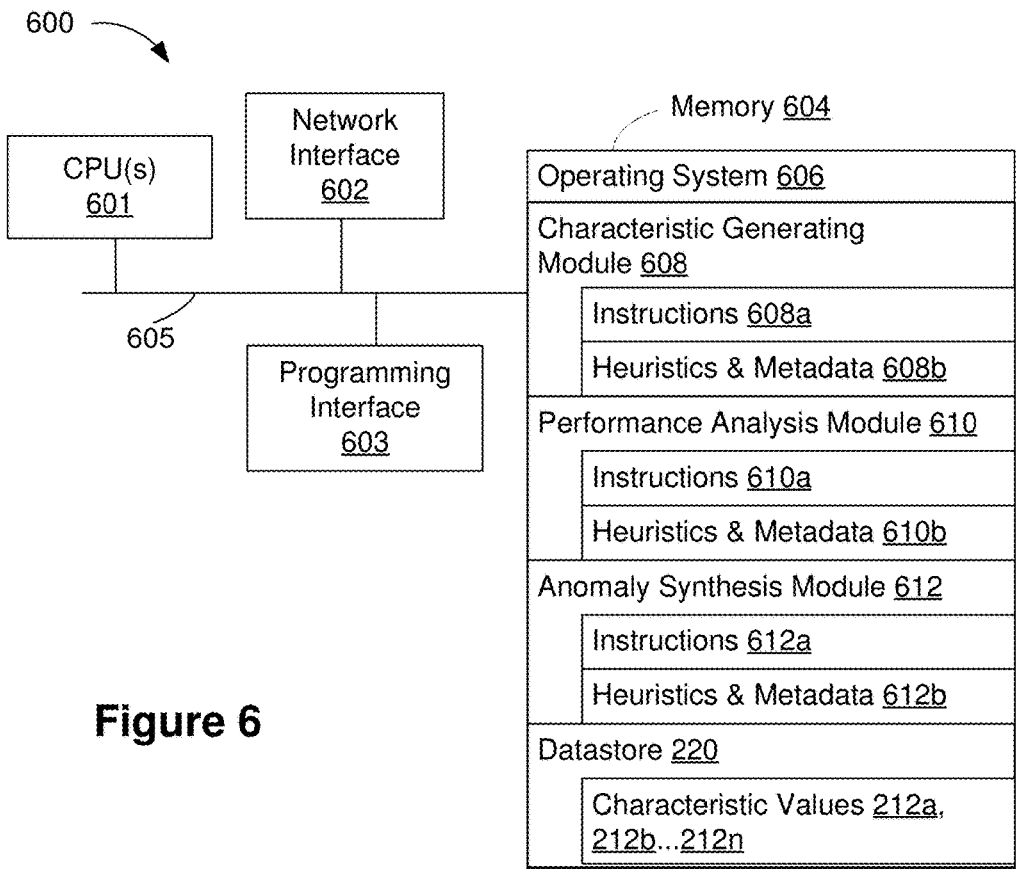


Figure 6

## IDENTIFYING ANOMALIES IN A NETWORK

### TECHNICAL FIELD

[0001] The present disclosure relates generally to networks, and in particular, to identifying anomalies in a network.

### BACKGROUND

[0002] The number of devices that are connected to networks has increased exponentially in recent years. As deployment of the Internet of things (IoT) advances, the number of network-connected devices will further increase. Some networks are susceptible to security attacks via the devices that are part of the network. As the number of devices in a network increase, the network often becomes more vulnerable to security attacks. Furthermore, some IoT devices lack hardware and/or software capability to prevent or thwart security attacks. Given the various device types that are currently connected to networks and additional device types that will likely connect to networks in the future, networks that rely heavily on static rules for security protection often fail to identify anomalies.

### BRIEF DESCRIPTION OF THE DRAWINGS

[0003] So that the present disclosure can be understood by those of ordinary skill in the art, a more detailed description may be had by reference to aspects of some illustrative implementations, some of which are shown in the accompanying drawings.

[0004] FIG. 1 is a schematic diagram of a network environment in accordance with some implementations.

[0005] FIG. 2 is a block diagram of an anomaly detector in accordance with some implementations.

[0006] FIG. 3 is a sequence diagram illustrating radio resource control (RRC) messages being exchanged in accordance with some implementations.

[0007] FIG. 4 is a sequence diagram illustrating non-access stratum (NAS) messages being exchanged in accordance with some implementations.

[0008] FIG. 5 is a flowchart representation of a method of identifying anomalies in accordance with some implementations.

[0009] FIG. 6 is a block diagram of a server system enabled with various modules that are provided to identify anomalies in a network in accordance with some implementations.

[0010] In accordance with common practice the various features illustrated in the drawings may not be drawn to scale. Accordingly, the dimensions of the various features may be arbitrarily expanded or reduced for clarity. In addition, some of the drawings may not depict all of the components of a given system, method or device. Finally, like reference numerals may be used to denote like features throughout the specification and figures.

### DESCRIPTION OF EXAMPLE EMBODIMENTS

[0011] Numerous details are described herein in order to provide a thorough understanding of the illustrative implementations shown in the accompanying drawings. However, the accompanying drawings merely show some example aspects of the present disclosure and are therefore not to be considered limiting. Those of ordinary skill in the art will appreciate from the present disclosure that other effective

aspects and/or variants do not include all of the specific details of the example implementations described herein. While pertinent features are shown and described, those of ordinary skill in the art will appreciate from the present disclosure that various other features, including well-known systems, methods, components, devices, and circuits, have not been illustrated or described in exhaustive detail for the sake of brevity and so as not to obscure more pertinent aspects of the example implementations disclosed herein.

### Overview

[0012] Various implementations disclosed herein enable identifying anomalies in a network. For example, in various implementations, a method of identifying anomalies in a network is performed by a network node. In various implementations, the network node includes one or more processors, and a non-transitory memory. In various implementations, the method includes generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type. In various implementations, the method includes determining, based on communications associated with the first device, a performance indicator that indicates a performance of the first device. In various implementations, the method includes synthesizing an anomaly indicator as a function of the performance indicator in relation to the characteristic indicator.

### Example Embodiments

[0013] FIG. 1 is a schematic diagram of a network environment 10. While certain specific features are illustrated, those of ordinary skill in the art will appreciate from the present disclosure that various other features have not been illustrated for the sake of brevity and so as not to obscure more pertinent aspects of the example implementations disclosed herein. To that end, the network environment 10 includes devices 22 of various device types 20a, 20b . . . 20n, and a cellular network 70 with various cellular network nodes 72a, 72b . . . 72n. In some implementations, the cellular network nodes 72a, 72b . . . 72n include corresponding anomaly detectors 74a, 74b . . . 74n. In some implementations, the anomaly detectors 74a, 74b . . . 74n, individually or in combination, detect anomalies in the cellular network 70. For example, in some implementations, the anomaly detectors 74a, 74b . . . 74n, individually or in combination, identify devices 22 that exhibit anomalous behavior. In some implementations, the anomaly detectors 74a, 74b . . . 74n protect the cellular network 70 from security threats by detecting anomalies. For example, in some implementations, the anomaly detectors 74a, 74b . . . 74n prevent and/or thwart security attacks on the cellular network nodes 72a, 72b . . . 72n by devices 22 that are malicious. In some implementations, the anomaly detectors 74a, 74b . . . 74n collectively form a distributed anomaly detector 76. In some implementations, the anomaly detectors 74a, 74b . . . 74n are collectively referred to as the distributed anomaly detector 76.

[0014] In various implementations, the cellular network 70 operates in accordance with 3GPP standards. For example, in some implementations, the cellular network 70 includes a fifth-generation (5G) cellular network. In various implementations, the cellular network nodes 72a, 72b . . . 72n perform various cellular-related functions. In some



implementations, at least some of the cellular network nodes **72a**, **72b** . . . **72n** form the core network architecture for the cellular network **70** (e.g., as defined by the 3GPP standards). In some implementations, at least some of the cellular network nodes **72a**, **72b** . . . **72n** form the Evolved Packet Core (EPC) portion of the cellular network **70**. In some implementations, the cellular network node **72a** includes a base station (e.g., an eNode B (eNB)) that provides the devices **22** access to the cellular network **70**. In some implementations, the cellular network node **72b** includes a Mobility Management Entity (MME) that serves as a signaling node in the cellular network **70**. For example, in some implementations, as the MME, the cellular network node **72b** initiates paging and authentication of the devices **22**.

[0015] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** identifies anomalies in the cellular network **70**. Briefly, in various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** identifies anomalies by grouping the devices **22** into the device types **20a**, **20b** . . . **20n**, generating corresponding characteristic indicators for the device types **20a**, **20b** . . . **20n**, determining corresponding performance indicators for the devices **22**, and synthesizing an anomaly indicator based on the performance indicators and the characteristic indicators.

[0016] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** groups the devices **22** into the device types **20a**, **20b** . . . **20n** based on one or more characteristics of the devices **22**. For example, in some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** groups the devices **22** into the device types **20a**, **20b** . . . **20n** based on functions of the devices **22**, identifiers of the devices **22** (e.g., IMEI of the devices **22**), and/or classmarks of the devices **22**. In the example of FIG. 1, the device type **20a** includes devices **22** that are appliances (e.g., microwave **22a**, washing machine **22b**, refrigerator **22c**, stoves, ovens, air conditioners, etc.). In the example of FIG. 1, the device type **20b** includes devices **22** that are vehicles (e.g., automobiles **22d** and **22e**, trains, airplanes, ships, etc.). In the example of FIG. 1, the device type **20c** includes devices **22** that are communication devices (e.g., mobile devices such as laptop **22f** and smartphone **22g**). In some implementations, the device types **20a**, **20b** . . . **20n** indicate operational characteristics of corresponding devices **22**. In the example of FIG. 1, since the device type **20a** includes appliances that are typically immobile, the device type **20a** corresponds to no/low mobility devices. In the example of FIG. 1, since the device type **20n** includes communication devices such as the smartphone **22g** that can be taken across continents, the device type **20n** corresponds to high mobility devices.

[0017] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** generates the corresponding characteristic indicators for the device types **20a**, **20b** . . . **20n** based on messages **24** communicated by the devices **22**. For example, in some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** generates a characteristic indicator for the device type **20a** based on messages **24a** communicated by the microwave **22a**, the washing machine **22b** and/or the refrigerator **22c**. In some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** generates a characteristic indicator for the device type **20b** based on messages **24b** communicated by the automobile **22d** and/or the automobile **22e**. In some

implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** generates a characteristic indicator for the device type **20n** based on messages **24n** communicated by the laptop **22f** and/or the smartphone **22g**. In some implementations, the characteristic indicators define thresholds for mobility, data throughput, types of messages communicated and/or number/frequency of messages communicated.

[0018] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** generates the corresponding performance indicators for the devices **22** based on the messages **24** communicated by the devices **22**. In some implementations, the performance indicators indicate respective performances of the devices **22**. In some implementations, the performance indicators indicate the mobility of the devices **22**. In some implementations, the performance indicators indicate the data throughput of the devices **22**. In some implementations, the performance indicators indicate the messages (e.g., a number of messages and/or a type of messages) communicated by the devices **22**.

[0019] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** synthesize an anomaly indicator based on the characteristic indicator(s) and the performance indicator(s). In some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** synthesize the anomaly indicator in response to the performance indicator(s) breaching the characteristic indicator(s). For example, in some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** synthesize the anomaly indicator in response to a difference between the performance indicator(s) and the characteristic indicator(s) being greater than a threshold. More generally, in various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** identify an anomaly based on the characteristic indicator(s) and the performance indicator(s), and synthesize the anomaly indicator in response to identifying the anomaly.

[0020] In some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** transmit the anomaly indicator to one of the devices **22** whose performance indicator breaches the characteristic indicator of the device type. In some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** transmit the anomaly indicator to a network administration device in order to identify one of the devices **22** whose performance indicator breaches the characteristic indicator of the device type. In some implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** transmit a command that limits an operation of at least one of the devices **22** whose performance indicator breaches the characteristic indicator of the device type (e.g., by deactivating the device, powering-down the device and/or quarantining the device).

[0021] In various implementations, the devices **22** includes transmitters and/or receivers (e.g., transceivers) that allow the devices **22** to communicate with the cellular network **70**. In some implementations, the devices **22** communicate with the cellular network **70** periodically (e.g., once a day, once a month, etc.). In some implementations, the devices **22** utilize a low power mode to communicate with the cellular network **70** (e.g., in order to conserve power). In various implementations, the messages **24** communicated between the devices **22** and the cellular network **70** include network layer messages. For example, in some implementations, the messages **24** communicated between the devices **22** and the cellular network **70** include non-

access stratum (NAS) messages (e.g., update messages, attach messages, authentication messages, service requests, etc.). In some implementations, the messages **24** communicated between the devices **22** and the cellular network **70** include radio resource control (RRC) messages (e.g., messages related to connection establishment, connection release, broadcast of system information, radio bearer establishment, reconfiguration, etc.). In some implementations, at least a portion of the messages **24** are transported by a protocol that operates below the Internet Protocol (IP) layer thereby circumventing security protections available at the IP layer. In various implementations, the methods, devices and/or systems discussed herein for anomaly detection operate at a layer below the IP layer (e.g., at the network layer) thereby providing security protection from the portion of messages **24** that are transported by protocols operating below the IP layer.

[0022] In various implementations, one or more of the anomaly detectors **74a**, **74b** . . . **74n** detect anomalous NAS messages and/or anomalous RRC messages communicated by the devices **22**. In some implementations, detecting anomalous NAS messages and/or anomalous RRC messages allows the anomaly detector(s) **74a**, **74b** . . . **74n** to prevent and/or thwart security attacks on the cellular network **70**. For example, in some implementations, in response to detecting anomalous NAS messages and/or anomalous RRC messages being communicated by a particular device **22**, the anomaly detector(s) **74a**, **74b** . . . **74n** limit an operation of that particular device **22** to reduce (e.g., stop) the anomalous NAS/RRC messages. In various implementations, reducing the anomalous NAS/RRC messages conserves resources of the cellular network **70** that would otherwise be utilized in processing the anomalous NAS/RRC messages. In various implementations, the anomaly detector(s) **74a**, **74b** . . . **74n** improve the operability of the cellular network **70** by detecting anomalous messages and forgoing processing of the anomalous messages thereby conserving resources (e.g., processing resources of the cellular network **70**) and improving the efficiency of the cellular network **70**. In some implementations, anomalous messages interrupt the operation of the cellular network **70**. As such, detecting anomalies and reducing the anomalous messages improves the operation of the cellular network **70** by increasing availability of the cellular network **70**.

[0023] FIG. 2 illustrates a block diagram of an anomaly detector **200** (e.g., the anomaly detectors **74a**, **74b** . . . and/or **74n**). In some implementations, the anomaly detector **200** includes a characteristic determiner **210**, a datastore **220**, a performance analyzer **230**, and an anomaly synthesizer **240**. Briefly, in various implementations, the characteristic determiner **210** determines (e.g., generates) corresponding characteristic indicators **212a**, **212b** . . . **212n** for the device types **20a**, **20b** . . . **20n** based on the messages **24a**, **24b** . . . **24n**, the performance analyzer **230** generates a performance indicator **232** that indicates the performance of at least one of the devices **22**, and the anomaly synthesizer **240** synthesizes an anomaly indicator **242** based on the performance indicator **232** and the characteristic indicators **212a**, **212b** . . . **212n**.

[0024] In various implementations, the characteristic determiner **210** determines corresponding characteristic indicators **212a**, **212b** . . . **212n** for the device types **20a**, **20b** . . . **20n** based on the messages **24a**, **24b** . . . **24n**, respectively. For example, in some implementations, the

characteristic determiner **210** determines the characteristic indicator **212a** for the device type **24a** based on the messages **24a** communicated by at least one of the devices of the device type **24a**. For example, the characteristic determiner **210** determines the characteristic indicator **212a** for the device type **24a** based on the messages **24a** communicated by the microwave **22a**, the washing machine **22b** and/or the refrigerator **22c**. Similarly, in some implementations, the characteristic determiner **210** determines the characteristic indicator **212b** for the device type **20b** based on the messages **24b** communicated by at least one of the devices of the device type **20b**. For example, the characteristic determiner **210** determines the characteristic indicator **212b** for the device type **20b** based on the messages **24b** communicated by the automobile **22d** and/or the automobile **22e**. Similarly, in some implementations, the characteristic determiner **210** determines the characteristic indicator **212n** for the device type **20n** based on the messages **24n** communicated by at least one of the devices of the device type **20n**. For example, the characteristic determiner **210** determines the characteristic indicator **212n** for the device type **20n** based on the messages **24n** communicated by the laptop **22f** and/or the smartphone **22g**.

[0025] In various implementations, the characteristic indicators **212a**, **212b** . . . **212n** include alphanumeric values. For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** include numerical values. In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** include labels. In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** include flags (e.g., binary values including 1 and 0).

[0026] In some implementations, the characteristic determiner **210** determines the corresponding characteristic indicators **212a**, **212b** . . . **212n** for the device types **20a**, **20b** . . . **20n** based on a function of individual characteristic indicators of devices in the device types **20a**, **20b** . . . **20n**. For example, in some implementations, the characteristic determiner **210** determines the characteristic indicator **212a** for the device type **20a** based on a function of individual characteristic indicators of devices of the device type **20a**. As an example, the characteristic determiner **210** determines the characteristic indicator **212a** for the device type **20a** based on a function of a characteristic indicator of the microwave **22a**, a characteristic indicator of the washing machine **22b**, and a characteristic indicator of the refrigerator **22c**. In some implementations, the characteristic indicator **212a** for the device type **20a** is an average of the characteristic indicator of the microwave **22a**, the characteristic indicator of the washing machine **22b**, and the characteristic indicator of the refrigerator **22c**. In some implementations, the characteristic indicator **212a** for the device type **20a** is a mean of the characteristic indicator of the microwave **22a**, the characteristic indicator of the washing machine **22b**, and the characteristic indicator of the refrigerator **22c**.

[0027] In various implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target operation (e.g., an expected operation) for devices of the device types **20a**, **20b** . . . **20n**, respectively. In various implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target performance (e.g., an expected performance) for devices of the device types **20a**, **20b** . . . **20n**, respectively. In various implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target number of commu-

nications and/or a target type of communications (e.g., an expected number of communications and/or an expected type of communications) for devices of the device types **20a**, **20b** . . . **20n**, respectively.

[0028] In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate target mobility levels (e.g., mobility thresholds) for devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate how much the devices of the device types **20a**, **20b** . . . **20n**, respectively, are expected to move. In some implementations, the target mobility levels defined by the characteristic indicators **212a**, **212b** . . . **212n** are based on a function of (e.g., an average of, or a mean of) individual characteristic indicators of devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the target mobility level defined by the characteristic indicator **212a** for the device type **20a** is a function of (e.g., an average of, or a mean of) mobility levels of the devices of the device type **20a** (e.g., the microwave **22a**, the washing machine **22b** and the refrigerator **22c** shown in FIG. 1). In the example of FIG. 1, the device type **20a** includes appliances that are typically immobile. As such, in some implementations, the characteristic indicator **212a** indicates that the target mobility level for the device type **20a** is no mobility or low mobility (e.g., exactly zero, or approximately zero).

[0029] In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate target data throughputs (e.g., data throughput thresholds) for devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate how much data the devices of the device types **20a**, **20b** . . . **20n**, respectively, are expected to receive/transmit. In some implementations, the target data throughputs defined by the characteristic indicators **212a**, **212b** . . . **212n** are based on a function of (e.g., an average of, or a mean of) individual data throughputs of devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the target data throughput defined by the characteristic indicator **212a** for the device type **20a** is a function of (e.g., an average of, or a mean of) data throughputs of the devices of the device type **20a** (e.g., the microwave **22a**, the washing machine **22b** and the refrigerator **22c** shown in FIG. 1). In the example of FIG. 1, the device type **20a** includes appliances that typically do not receive/transmit a significant amount of data. As such, in some implementations, the characteristic indicator **212a** indicates that the target data throughput for the device type **20a** is relatively low (e.g., less than 1 MB/day, less than 3 MB/week, less than 10 MB/month, etc.).

[0030] In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target communication type (e.g., an expected communication type) for devices of the device types **20a**, **20b** . . . **20n**, respectively. In some implementations, the target communication type indicates types of communications that are not permitted/expected. For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a type of messages that devices of the device types **20a**, **20b** . . . **20n**, respectively, are expected to receive/transmit. In some implementations, the target communication type defined by the characteristic indicators **212a**, **212b** . . . **212n** is based on individual communication types of devices of the device

types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the target communication type defined by the characteristic indicator **212a** for the device type **20a** includes types of messages that are communicated by at least a portion of the devices of the device type **20a** (e.g., the microwave **22a**, the washing machine **22b** and/or the refrigerator **22c** shown in FIG. 1). In the example of FIG. 1, the device type **20a** includes appliances that typically do not communicate messages related to cell handover. As such, in some implementations, the characteristic indicator **212a** indicates that the target communication type for the device type **20a** excludes cell handover messages.

[0031] In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target number/frequency of communications (e.g., communication number/frequency threshold) for devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a number/frequency of messages that devices of the device types **20a**, **20b** . . . **20n**, respectively, are expected to receive/transmit. In some implementations, the target number/frequency of communications defined by the characteristic indicators **212a**, **212b** . . . **212n** is based on individual number/frequency of communications by devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the target number/frequency of communications defined by the characteristic indicator **212a** for the device type **20a** is a function of (e.g., an average of, or a mean of) the number/frequency of communications by at least a portion of the devices of the device type **20a** (e.g., the microwave **22a**, the washing machine **22b** and/or the refrigerator **22c** shown in FIG. 1). In the example of FIG. 1, the device type **20a** includes appliances that typically do not communicate messages often. As such, in some implementations, the characteristic indicator **212a** indicates that the target number/frequency of communications for the device type **20a** is less than one message per hour, one message per day, ten messages per month, etc.

[0032] In some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate a target direction of communication (e.g., an expected direction of communication) for devices of the device types **20a**, **20b** . . . **20n**, respectively. In some implementations, the target direction of communication indicates whether a majority of the communications (e.g., all the communications) are incoming (e.g., messages received) or outgoing (e.g., messages transmitted). For example, in some implementations, the characteristic indicators **212a**, **212b** . . . **212n** indicate whether the devices of the device types **20a**, **20b** . . . **20n**, respectively, are expected to receive or transmit data (e.g., messages). In some implementations, the target direction of communication defined by the characteristic indicators **212a**, **212b** . . . **212n** is based on individual directions of communication of devices of the device types **20a**, **20b** . . . **20n**, respectively. For example, in some implementations, the target direction of communication defined by the characteristic indicator **212a** for the device type **20a** is based on the directions of communication of at least a portion of the devices of the device type **20a** (e.g., the microwave **22a**, the washing machine **22b** and/or the refrigerator **22c** shown in FIG. 1). In some implementations, the target direction of communication includes a ratio of incoming and outgoing data. In the example of FIG. 1, the device type **20a** includes appliances that typically do not request significant amounts

of data. As such, in some implementations, the characteristic indicator **212a** indicates that the target direction of communication for the device type **20a** is predominantly outgoing (e.g., 90% outgoing and 10% incoming).

[0033] In various implementations, the characteristic determiner **210** generates the characteristic indicators **212a**, **212b** . . . **212n** periodically (e.g., once a day, once a week, once a month, etc.). In some implementations, the characteristic determiner **210** generates the characteristic indicators **212a**, **212b** . . . **212n** in response to a threshold change in the number/percentage of devices **22**. For example, in some implementations, the characteristic determiner **210** generates the characteristic indicator **212a** for the device type **20a** in response to a threshold number/percentage of new devices of device type **20a** being initialized. In some implementations, the characteristic determiner **210** generates the characteristic indicator **212a** for the device type **20a** in response to a threshold number/percentage of existing devices of device type **20a** being deactivated/decommissioned.

[0034] In some implementations, the characteristic determiner **210** updates the characteristic indicators **212a**, **212b** . . . **212n** after generating the characteristic indicators **212a**, **212b** . . . **212n**. For example, in some implementations, the characteristic determiner **210** updates the characteristic indicators **212a**, **212b** . . . **212n** based on additional messages communicated by the devices **22**.

[0035] In various implementations, the characteristic determiner **210** utilizes devices, methods and/or systems associated with machine learning to generate the characteristic indicators **212a**, **212b** . . . **212n**. For example, in some implementations, the characteristic determiner **210** utilizes a learning agent to generate the characteristic indicators **212a**, **212b** . . . **212n**. In various implementations, the characteristic determiner **210** generates the characteristic indicators **212a**, **212b** . . . **212n** automatically (e.g., without human intervention, for example, without a sequence of user inputs).

[0036] In various implementations, the characteristic determiner **210** stores the characteristic indicators **212a**, **212b** . . . **212n** in the datastore **220**.

[0037] In various implementations, the performance analyzer **230** generates a performance indicator **232** that indicates a performance of at least one of the devices **22**. In the example of FIG. 2, the performance indicator **232** indicates a performance of the refrigerator **22c**. As shown in FIG. 2, the performance indicator **232** for the refrigerator **22c** is based on messages **24ac** communicated (e.g., transmitted and/or received) by the refrigerator **22c**.

[0038] In various implementations, the performance indicator **232** indicates a mobility level of the refrigerator **22c**. In some implementations, the performance indicator **232** indicates a data throughput of the refrigerator **22c**. For example, in some implementations, the performance indicator **232** indicates an amount of data that the refrigerator **22c** is receiving/transmitting. In some implementations, the performance indicator **232** indicates a type of communication associated with the refrigerator **22c**. For example, in some implementations, the performance indicator **232** indicates whether the refrigerator **22c** is communicating messages related to cell handovers. In some implementations, the performance indicator **232** indicates a number/frequency of communications associated with the refrigerator **22c**. For example, in some implementations, the performance indi-

cator **232** indicates a number of messages being transmitted/received by the refrigerator **22c**. In some implementations, the performance indicator **232** indicates a direction of communication associated with the refrigerator **22c**. For example, in some implementations, the performance indicator **232** indicates whether the refrigerator **22c** is predominantly receiving data or transmitting data. In some implementations, the performance indicator **232** indicates a ratio of messages being transmitted and received by the refrigerator **22c**. In various implementations, the performance analyzer **230** provides the performance indicator **232** to the anomaly synthesizer **240**.

[0039] In various implementations, the anomaly synthesizer **240** synthesizes an anomaly indicator **242** based on the performance indicator **232** and a corresponding one of the characteristic indicators **212a**, **212b** . . . **212n**. In the example of FIG. 2, since the refrigerator **22c** is of device type **20a**, the anomaly synthesizer **240** retrieves the characteristic indicator **212a** for the device type **20a**. As illustrated in FIG. 2, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** based on the performance indicator **232** and the characteristic indicator **212a**. In various implementations, the anomaly indicator **242** indicates that there is an anomaly at one of the devices **22** (e.g., at the refrigerator **22c**).

[0040] In various implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to the performance indicator **232** breaching a function of the characteristic indicator **212a**. For example, in some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a difference between the performance indicator **232** and the characteristic indicator **212a** being greater than a threshold. In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to the performance indicator **232** being greater than the characteristic indicator **212a**.

[0041] In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a mobility level indicated by the performance indicator **232** breaching (e.g., being greater than) the target mobility level (e.g., the mobility threshold) defined by the characteristic indicator **212a**. In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a data throughput indicated by the performance indicator **232** breaching (e.g., being greater than) the target data throughput (e.g., the data throughput threshold) defined by the characteristic indicator **212a**. In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a communication type indicated by the performance indicator **232** breaching (e.g., being different from) the target communication type(s) defined by the characteristic indicator **212a**. In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a number/frequency of communications indicated by the performance indicator **232** breaching (e.g., exceeding) the target number/frequency of communications (e.g., communication number/frequency threshold) defined by the characteristic indicator **212a**. In some implementations, the anomaly synthesizer **240** synthesizes the anomaly indicator **242** in response to a direction of communication indicated by the performance indicator **232** breaching (e.g., being different from) the target direction of communication defined by the characteristic indicator **212a**. In various implementations, the anomaly synthesizer

**240** synthesizes the anomaly indicator **242** in response to a device operation indicated by the performance indicator **232** breaching (e.g., being different from) a target operation (e.g., a threshold operation) defined by the characteristic indicator **212a**.

[0042] In some implementations, the anomaly detector **200** (e.g., the anomaly synthesizer **240**) transmits the anomaly indicator **242** to one of the devices **22** (e.g., to the refrigerator **22c**). In some implementations, the anomaly detector **200** transmits the anomaly indicator **242** to an operating entity that controls operation of at least a portion of the cellular network **70**. In some implementations, the anomaly detector **200** transmits the anomaly indicator **242** to a network/system administration device (e.g., a network/system administration computer that controls operation of the devices **22**).

[0043] As illustrated in FIG. 2, in some implementations, the anomaly detector **200** (e.g., the anomaly synthesizer **240**) generates and transmits a command **244** to the refrigerator **22c**. In some implementations, the command **244** limits an operation of the refrigerator **22c**. For example, in some implementations, the command **244** deactivates the refrigerator **22c**, so that the refrigerator **22c** is unable to communicate with the cellular network **70**. In some implementations, the command **244** quarantines the refrigerator **22c**, so that communications transmitted by the refrigerator **22c** are not processed by the cellular network **70**. In some implementations, the command **244** shuts down (e.g., powers-down) the refrigerator **22c**. In some implementations, the command **244** causes the refrigerator **22c** to download and execute computer-readable instructions corresponding to a security patch. More generally, in various implementations, the anomaly detector **200** (e.g., the anomaly synthesizer **240**) generates and transmits the command **244** in order to limit an operation of one or more of the devices **22** that are associated with the performance indicator **232** in response to the performance indicator **232** breaching a corresponding one of the characteristic indicators **212a**, **212b** . . . **212n**.

[0044] FIG. 3 is a sequence diagram illustrating various RRC and NAS messages **34** being exchanged in accordance with some implementations. In some implementations, the anomaly detector **200** (e.g., characteristic determiner **210**) utilizes one or more of the RRC and NAS messages **34** to determine the characteristic indicators **212a**, **212b** . . . **212n**. In the example of FIG. 3, the RRC and NAS messages **34** corresponds to a RRC exchange. As illustrated in FIG. 3, in some implementations, the RRC and NAS messages **34** include messages related to:

- [0045] RRC connection establishment **302**;
- [0046] NAS attach request and/or packet data network (PDN) connectivity request **304**;
- [0047] NAS identity, authentication, security mode command (SMC) procedures **306**;
- [0048] update location request **308**;
- [0049] update location response **310**;
- [0050] create session request **312**;
- [0051] create session response **314**;
- [0052] initial context setup request **316**;
- [0053] AS security mode command **318**;
- [0054] AS security mode complete **320**;
- [0055] RRC connection reconfiguration **322**;
- [0056] RRC reconfiguration complete **324**;
- [0057] initial context setup response **326**;
- [0058] modify bearer request **328**;

[0059] modify bearer response **330**;

[0060] NAS attach acc and/or act def bearer context request **332**; and

[0061] NAS attach complete and/or act def bearer context acc **334**.

[0062] In the example of FIG. 3, some of the RRC and NAS messages **34** include messages between the device **22** and one of the cellular network nodes **72a** (e.g., eNB), **72b** (e.g., MME), **72c** (e.g., home subscriber base (HSB), **72d** (e.g., serving gateway (SGW)) and **72e** (e.g., packet gateway (PGW)), while other RRC and NAS messages **34** includes messages exchanged between the cellular network nodes **72a**, **72b**, **72c**, **72d** and **72e**.

[0063] FIG. 4 is a sequence diagram illustrating non-access stratum (NAS) messages **44** being exchanged in accordance with some implementations. In some implementations, the anomaly detector **200** (e.g., characteristic determiner **210**) utilizes one or more of the NAS messages **44** to determine the characteristic indicators **212a**, **212b** . . . **212n**. In the example of FIG. 4, the NAS messages **44** corresponds to a NAS exchange. As illustrated in FIG. 4, in some implementations, the NAS messages **44** include messages related to:

- [0064] NAS identity request **402**;
- [0065] NAS identity response **404**;
- [0066] NAS authentication request **406**;
- [0067] NAS authentication response **408**;
- [0068] NAS security mode command **410**; and
- [0069] NAS security mode complete **412**.

[0070] In the example of FIG. 4, some of the NAS messages **44** include messages between the device **22** and the cellular network node **72b** (e.g., MME).

[0071] FIG. 5 is a flowchart representation of a method **500** of identifying anomalies in accordance with some implementations. In various implementations, the method **500** is implemented as a set of computer readable instructions that are executed at an anomaly detector (e.g., the anomaly detector **200** shown in FIG. 2, and/or the anomaly detectors **74a**, **74b** . . . **74n** shown in FIG. 1). Briefly, the method **500** includes generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type, determining a performance indicator that indicates a performance of the first device, and synthesizing an anomaly indicator based on the performance indicator and the characteristic indicator.

[0072] As represented by block **510**, in various implementations, the method **500** includes generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type (e.g., the characteristic indicators **212a**, **212b** . . . **212n** for device types **20a**, **20b** . . . **20n**, respectively). As represented by block **510a**, in some implementations, the method **500** includes generating the characteristic indicator based on individual characteristic indicators of respective devices in the device type (e.g., generating the characteristic indicator **212a** based on individual characteristic indicators of the microwave **22a**, the washing machine **22b** and the refrigerator **22c** shown in FIG. 1). As represented by block **510b**, in some implementations, the method **500** includes generating the characteristic indicator based on NAS messages and/or RRC messages communication by the first device (e.g., as shown in FIGS. 3 and 4). As represented by block **510c**, in some implementations, the method **500** includes generating a characteristic indicator that defines targets/

thresholds for mobility, data throughput, types of communication, number/frequency of communications, and/or direction of communication. In some implementations, the method 500 includes updating the characteristic indicator based on additional messages communicated by the first device. As described herein, in various implementations, the method 500 includes generating the characteristic indicator by utilizing methods, devices and/or systems associated with machine learning. For example, in some implementations, the method 500 includes utilizing a learning agent (e.g., a distributed learning agent) to generate the characteristic indicator.

[0073] As represented by block 520, in various implementations, the method 500 includes determining a performance indicator (e.g., the performance indicator 232 shown in FIG. 2) that indicates a performance of the first device. In some implementations, the method 500 includes determining the performance indicator based on communications associated with the first device. For example, in some implementations, the method 500 includes determining the performance indicator based on messages transmitted/received by the first device. As represented by block 520a, in some implementations, the method 500 includes determining the performance indicator based on NAS/RRC messages communicated by the first device (e.g., the NAS/RRC messages shown in FIGS. 3 and 4). As represented by block 520b, in some implementations, the method 500 includes determining a performance indicator that indicates a mobility level, a data throughput, types of communications, number/frequency of communications, direction of communication associated with the first device.

[0074] As represented by block 530, in various implementations, the method 500 includes synthesizing an anomaly indicator (e.g., the anomaly indicator 242 shown in FIG. 2) based on the performance indicator and the characteristic indicator. As represented by block 530a, in some implementations, the method 500 includes synthesizing the anomaly indicator in response to the performance indicator breaching a function of the characteristic indicator. For example, in some implementations, the method 500 includes synthesizing the anomaly indicator in response to the performance indicator being greater than the characteristic indicator. In some implementations, the method 500 includes synthesizing the anomaly indicator in response to a difference between the performance indicator and the characteristic indicator being greater than a threshold. As represented by block 530b, in some implementations, the method 500 includes transmitting the anomaly indicator. In some implementations, the method 500 includes transmitting the anomaly indicator to a network/system administration device (e.g., to an operator entity that controls at least a portion of the cellular network). As represented by block 530c, in some implementations, the method 500 includes transmitting a command (e.g., the command 244) to the first device. In some implementations, the command limits an operation of the first device (e.g., by deactivating/quarantining/shutting off the first device).

[0075] FIG. 6 is a block diagram of a server system 600 enabled with one or more components of an anomaly detector (e.g., the anomaly detector 200 shown in FIG. 2 and/or the anomaly detectors 74a, 74b . . . 74n shown in FIG. 1) in accordance with some implementations. While certain specific features are illustrated, those of ordinary skill in the art will appreciate from the present disclosure that various

other features have not been illustrated for the sake of brevity, and so as not to obscure more pertinent aspects of the implementations disclosed herein. To that end, as a non-limiting example, in some implementations the server system 600 includes one or more processing units (CPUs) 601, a network interface 602, a programming interface 603, a memory 604, and one or more communication buses 605 for interconnecting these and various other components.

[0076] In some implementations, the network interface 602 is provided to, among other uses, establish and maintain a metadata tunnel between a cloud hosted network management system and at least one private network including one or more compliant devices. In some implementations, the communication buses 605 include circuitry that interconnects and controls communications between system components. The memory 604 includes high-speed random access memory, such as DRAM, SRAM, DDR RAM or other random access solid state memory devices; and may include non-volatile memory, such as one or more magnetic disk storage devices, optical disk storage devices, flash memory devices, or other non-volatile solid state storage devices. The memory 604 optionally includes one or more storage devices remotely located from the CPU(s) 601. The memory 604 comprises a non-transitory computer readable storage medium.

[0077] In some implementations, the memory 604 or the non-transitory computer readable storage medium of the memory 604 stores the following programs, modules and data structures, or a subset thereof including an optional operating system 606, a characteristic generating module 608, a performance analysis module 610, an anomaly synthesis module 612, and the datastore 220. In various implementations, the characteristic generating module 608, the performance analysis module 610 and the anomaly synthesis module 612 perform substantially the same operations as the characteristic determiner 210, the performance analyzer 230 and the anomaly synthesizer 240, respectively, shown in FIG. 2. For example, in various implementations, the characteristic generating module 608 generates characteristic indicators for corresponding device types (e.g., the characteristic indicators 212a, 212b . . . 212n for the device types 20a, 20b . . . 20n, respectively). To that end, in various implementations, the characteristic generating module 608 includes instructions and/or logic 608a, and heuristics and metadata 608b. In some implementations, the characteristic generating module 608 stores the characteristic indicators 212a, 212b . . . 212n in the datastore 220. In some implementations, the performance analysis module 610 determines a performance indicator that indicates a performance of at least one device (e.g., the performance indicator 232 shown in FIG. 2). To that end, in various implementations, the performance analysis module 610 includes instructions and/or logic 610a, and heuristics and metadata 610b. In some implementations, the anomaly synthesis module 612 synthesizes an anomaly indicator (e.g., the anomaly indicator 242 shown in FIG. 2) based on the performance indicator and the characteristic indicator. To that end, in various implementations, the anomaly synthesis module 612 includes instructions and/or logic 612a, and heuristics and metadata 612b.

[0078] While various aspects of implementations within the scope of the appended claims are described above, it should be apparent that the various features of implementations described above may be embodied in a wide variety

of forms and that any specific structure and/or function described above is merely illustrative. Based on the present disclosure one skilled in the art should appreciate that an aspect described herein may be implemented independently of any other aspects and that two or more of these aspects may be combined in various ways. For example, an apparatus may be implemented and/or a method may be practiced using any number of the aspects set forth herein. In addition, such an apparatus may be implemented and/or such a method may be practiced using other structure and/or functionality in addition to or other than one or more of the aspects set forth herein.

**[0079]** It will also be understood that, although the terms “first,” “second,” etc. may be used herein to describe various elements, these elements should not be limited by these terms. These terms are only used to distinguish one element from another. For example, a first contact could be termed a second contact, and, similarly, a second contact could be termed a first contact, which changing the meaning of the description, so long as all occurrences of the “first contact” are renamed consistently and all occurrences of the second contact are renamed consistently. The first contact and the second contact are both contacts, but they are not the same contact.

**[0080]** The terminology used herein is for the purpose of describing particular embodiments only and is not intended to be limiting of the claims. As used in the description of the embodiments and the appended claims, the singular forms “a,” “an” and “the” are intended to include the plural forms as well, unless the context clearly indicates otherwise. It will also be understood that the term “and/or” as used herein refers to and encompasses any and all possible combinations of one or more of the associated listed items. It will be further understood that the terms “comprises” and/or “comprising,” when used in this specification, specify the presence of stated features, integers, steps, operations, elements, and/or components, but do not preclude the presence or addition of one or more other features, integers, steps, operations, elements, components, and/or groups thereof.

**[0081]** As used herein, the term “if” may be construed to mean “when” or “upon” or “in response to determining” or “in accordance with a determination” or “in response to detecting,” that a stated condition precedent is true, depending on the context. Similarly, the phrase “if it is determined [that a stated condition precedent is true]” or “if [a stated condition precedent is true]” or “when [a stated condition precedent is true]” may be construed to mean “upon determining” or “in response to determining” or “in accordance with a determination” or “upon detecting” or “in response to detecting” that the stated condition precedent is true, depending on the context.

**1. A method comprising:**

at a network node including a non-transitory memory, and one or more processors coupled with the non-transitory memory:

generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type, wherein the characteristic indicator indicates a threshold for the device type;

determining, based on communications associated with the first device, a performance indicator that indicates a performance of the first device; and

synthesizing an anomaly indicator in response to the performance indicator breaching the threshold for the device type.

**2. The method of claim 1, wherein generating the characteristic indicator comprises:**

generating the characteristic indicator for the device type based on individual characteristic indicators of respective devices in the device type.

**3. The method of claim 2, wherein the characteristic indicator for the device type is an average of the individual characteristic indicators.**

**4. The method of claim 1, wherein the communications include one or more of non-access stratum (NAS) messages and radio resource control (RRC) messages.**

**5. The method of claim 1, wherein:**

the characteristic indicator indicates a mobility threshold for the device type;

the performance indicator indicates a mobility of the first device; and

synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the mobility of the first device breaching the mobility threshold for the device type.

**6. The method of claim 1, wherein:**

the characteristic indicator indicates a data throughput threshold for the device type;

the performance indicator indicates a data throughput of the first device; and

synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the data throughput of the first device breaching the data throughput threshold for the device type.

**7. The method of claim 1, wherein:**

the characteristic indicator indicates a threshold number of cell handover requests for the device type over a given period of time;

the performance indicator indicates a number of cell handover requests for the first device requested over the given period of time; and

synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the number of cell handover requests for the first device breaching the threshold number of cell handover requests for the device type.

**8. An anomaly detector comprising:**

a processor provided to execute computer readable instructions included on a non-transitory memory; and

a non-transitory memory including computer readable instructions, that when executed by the processor, cause the anomaly detector to:

generate a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type, wherein the characteristic indicator indicates a threshold for the device type;

determine, based on communications associated with the first device, a performance indicator that indicates a performance of the first device; and

synthesize an anomaly indicator in response to the performance indicator breaching the threshold for the device type.

**9. The anomaly detector of claim 8, wherein generating the characteristic indicator comprises:**

generating the characteristic indicator for the device type based on individual characteristic indicators of respective devices in the device type.

**10.** The anomaly detector of claim **9**, wherein the characteristic indicator for the device type is an average of the individual characteristic indicators.

**11.** The anomaly detector of claim **8**, wherein the communications include one or more of non-access stratum (NAS) messages and radio resource control (RRC) messages.

**12.** The anomaly detector of claim **8**, wherein:  
the characteristic indicator indicates a mobility threshold for the device type;  
the performance indicator indicates a mobility of the first device; and  
synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the mobility of the first device breaching the mobility threshold for the device type.

**13.** The anomaly detector of claim **8**, wherein:  
the characteristic indicator indicates a data throughput threshold for the device type;  
the performance indicator indicates a data throughput of the first device; and  
synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the data throughput of the first device breaching the data throughput threshold for the device type.

**14.** The anomaly detector of claim **8**, wherein:  
the characteristic indicator indicates a threshold number of cell handover requests for the device type over a given period of time;  
the performance indicator indicates a number of cell handover requests for the first device requested over the given period of time; and  
synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the number of cell handover requests for the first device breaching the threshold number of cell handover requests for the device type.

**15.** The anomaly detector of claim **8**, wherein synthesizing the anomaly indicator comprises:  
transmitting the anomaly indicator.

**16.** The anomaly detector of claim **8**, wherein synthesizing the anomaly indicator comprises:  
transmitting a command that limits an operation of the first device.

**17.** The anomaly detector of claim **8**, wherein determining the performance indicator comprises:  
analyzing one or more of NAS messages and RRC messages communicated by the first device; and  
determining the performance indicator based on one or more of the NAS messages and the RRC messages communicated by the first device.

**18.** The anomaly detector of claim **8**, wherein the computer readable instructions further cause the anomaly detector to:  
update the characteristic indicator based on additional communications associated with the first device.

**19.** A non-transitory computer readable storage medium storing one or more programs, the one or more programs comprising instructions, which, when executed by an anomaly detector with a processing device, cause the anomaly detector to perform or cause performance of:  
generating a characteristic indicator that characterizes a device type based on communications associated with a first device of the device type, wherein the characteristic indicator indicates a threshold for the device type;  
determining, based on communications associated with the first device, a performance indicator that indicates a performance of the first device; and  
synthesizing an anomaly indicator in response to the performance indicator breaching the threshold for the device type.

**20.** The non-transitory computer readable storage medium of claim **19**, wherein:  
the characteristic indicator indicates a mobility threshold for the device type;  
the performance indicator indicates a mobility of the first device; and  
synthesizing the anomaly indicator comprises synthesizing the anomaly indicator in response to the mobility of the first device breaching the mobility threshold for the device type.

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