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## The Internet of Energy: Smart Sensor Networks and Big Data Management for Smart Grid

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### Abstract

Smart sensor networks provide numerous opportunities for smart grid applications including power monitoring, demand-side energy management, coordination of distributed storage, and integration of renewable energy generators. Because of their low cost and ease-of-deployment, smart sensor networks are likely to be used on a large scale in future of smart power grids. The result is a huge volume of different variety of data sets. Processing and analyzing these data reveals deeper insights that can help expert to improve the operation of power grid to achieve better performance. The technology to collect massive amounts of data is available today, but managing the data efficiently and extracting the most useful information out of it remains a challenge. This paper discusses and provides recommendations and practices to be used in the future of smart grid and Internet of things. We explore the different applications of smart sensor networks in the domain of smart power grid. Also we discuss the techniques used to manage big data generated by sensors and meters for application processing.

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**Keywords:** Internet of Things; Smart Grid, Big Data; Smart Sensor Network; Hierarchical Communication Infrastructure;

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### 1. Introduction

The electricity demand globally is expected to increase more than two-thirds by the year of 2035 according to the International Energy Agency<sup>1</sup>. Such increase in electricity demand will put a higher burden on the current outdated and overstressed power infrastructure. In addition, it will cause serious network congestion problems and degrade the quality of the transferred power. The existing power grid suffers from unreliability due to the lack of efficient monitoring, fault diagnostic, and automation techniques. The current network infrastructure suffers from inflexibility

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in integrating new distributed energy sources which makes adding renewable energy sources a challenging task. This will have a negative impact in providing solutions to have a cleaner environment.

Smart grid has emerged to tackle these challenges, where the name suggests an intelligent power infrastructure. Smart grid technology promises to make the world power systems more secure, reliable, efficient, flexible, and sustainable<sup>2</sup>. It achieves these goals through the integration of information and communication networks. Intelligent algorithms for information collection and processing are being and will be developed to provide automated control over the power grid. In smart grid, a reliable and real-time monitoring is highly required to provide solutions quickly when natural accidents or catastrophes occur to prevent power disturbance and outage. Hence, intelligent monitoring and sensing capabilities to insure real-time response from the power grid are necessary. Wireless sensor networks (WSNs) can be used as compared to traditional communication technologies because of its low-cost, rapid deployment, flexibility, and aggregated intelligence via parallel processing<sup>3</sup>. However, better security solutions are needed to prevent the network from any malicious behaviors, sniffing, or attackers.

The integration of WSNs, actuators, smart meters, and other components of the power grid with together with information and communication technology (ICT), is referred to as the Internet of Energy (IoE). IoE uses the bidirectional flow of energy and information within the smart grid to gain deep insights on power usage and predicts future actions to increase energy efficiency and low overall cost<sup>4</sup>.

According to reports, 800 millions smart meters are expected to be installed globally by 2020<sup>5</sup>. In order to achieve fine-grain monitoring and scheduling, information from the power grid needs to be collected within short intervals. Assuming that smart meters take one record every 15 minutes, this leads to about 77 billions of readings globally during one day. Such huge amount of data could overwhelm existing processing and storage techniques and systems. Utility companies need these readings to have a better understanding of end users' behaviors regarding consumption and pricing policies<sup>6</sup>.

To manage the massive amounts of data generated from smart meters and other components of the grid, utility companies can use services provided by cloud infrastructures. Services that are provided by cloud enterprises and infrastructures for smart grid users include: provide a storage space, energy resources management, and virtual power plant. Latency and security of cloud computing might be the reasons for utility companies not to adopt cloud systems. However, Fog computing or edge computing deals with the IoT in a distributed manner rather than using the centralized cloud computing model. It aims to minimize latency and improve the bandwidth usage. This paper is structured as follows. Section 2 provides a background discussion on the Internet of things and its applications in smart grid. Section 3 discusses some of the existing techniques to manage big data in the smart grid. And finally we conclude the paper in Section 4.

## 2. Internet of Things

IoT technology is the interconnection of different networked embedded devices used in the everyday life integrated into the Internet. It aims to automate the operation of different domains such as home appliances, health care systems, security and surveillance systems, industrial systems, transportation systems, military systems, electrical systems, and many others. In order to achieve a fully automated process, devices in the different domains must be equipped with micro-controllers, transceivers, and protocols to facilitate and standardize their communication with each other and with external entities<sup>7</sup>.

IoT system is composed of three layers: the perception layer, the network layer, and the application layer<sup>8</sup> as shown in Figure 1. The perception layer includes a group of Internet-enabled devices that can perceive, detect objects, collect systems information, and exchange information with other devices through the Internet communication networks. Sensors, Global Positioning Systems (GPS), cameras, and Radio Frequency Identification Devices (RFID) are examples of devices that exist at perception layer. The network layer is responsible of forwarding data from perception layer to the application layer under the constraints of devices' capabilities, network limitation and the applications' constraints. IoT systems use a combination of Internet and short-range networks based on the communicated parties<sup>9</sup>. Short-range communication technologies such as Bluetooth and ZigBee, are used to carry the information from perception devices to a nearby gateway. Other technologies such as WiFi, 2G, 3G, 4G, and Power line Communication (PLC) carry the information for long distances based on the application. The upper layer is the application layer, where incoming information is processed to induce insights upon which we can design better power's distribution and

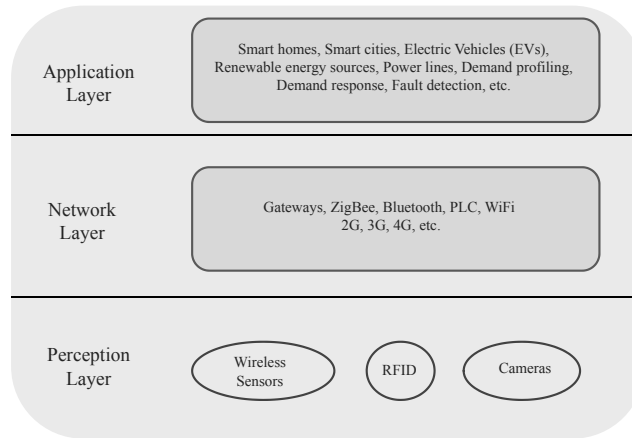


Fig. 1. Architecture of IoT

management strategies. Applications aim to create smart homes, smart cities, power system monitoring, demand-side energy management, coordination of distributed power storage, and integration of renewable energy generators. The next subsections discuss these group of applications.

#### *Smart homes and smart cities*

In smart grid application, there is a high expectations of the IoT technology to result in having smart homes and appliances such as: smart refrigerators, smart TVs, home security system, lighting control, fire detection, temperature monitoring. These systems and appliances include sensors and actuators that monitor the environment and send surveillance data to a control unit at home. The control unit enables the householders to continuously monitor and fully control the electrical appliances. It also uses the surveillance data to predict future activities to be prepared in advance for a more convenient, comfortable, secure, and efficient living environment.

A group of smart homes in a neighborhood are connected through a Neighbor Area Network (NAN) to form a smart community<sup>10</sup>. In a smart community, homes share the results of their outdoor surveillance cameras to detect any accident and might inform police stations. Other applications of the smart community concept are in health care, managing shared resources, and enabling support social networking.

The concept of a smart community is extended to develop a smart city in<sup>11</sup>. In a smart city a comprehensive surveillance system is developed to monitor different activities within an entire city or a country.

#### *Online monitoring of power lines*

As more buildings and areas are being covered with power line systems, the number and severity of power outages become more serious leading to lower system's reliability<sup>12</sup>. Reliability is important as it causes serious negative impacts on public health and economical systems. Integration of IoTs technology together with the power grid, aims to improve the reliability of power grids through a continuous monitoring of transmission lines' status; in addition to environmental behaviors and consumers' activities to send periodic reports to the grid control units. The control units process and extract information from the reported data in order to detect faults, isolate the fault, and then resolve faults intellectually.

Performing energy restoration in smart grid must take into the account the location criticality of blackouts. For examples, It is critical to guarantee high reliability for health and industrial systems. The restoration problem becomes a very complex problem when taking into the consideration the large number of combinations of switching operations which exponentially increases with the increase in system's components<sup>13,14</sup>. Designing the smart grid in a hierarchical model<sup>15</sup> divides the problem into multiple control units in charge of restoring power within its region or scope. This enhance the time needed to process the data and speeds up the restoration process. If some control units

fail to restore energy in some regions within their scope, they forward the problem to upper levels for better action and handling as higher levels have a larger system's view.

#### *Demand-side energy management*

Demand-Side Energy Management (DSM) is the change in consumers energy consumption profiles according to varying electricity price over time, and other payment's incentives from utility companies<sup>16</sup>. Demand response is used to minimize consumer's electricity bill, shift peak's load demand, minimize operation cost of the power grid, and minimize energy loss and greenhouse's gas emissions<sup>17,18</sup>. IoT components collect energy requirements of different home appliances and send them to smart meters. The control unit in smart grid schedules energy consumption of homes' appliances according to the user's preferences in a strategy that minimizes the electricity bill.

The DSM problem can be solved at different levels of the hierarchical smart grid infrastructure. It can be solved at the level of home premises to preserve consumers privacy<sup>19,20</sup>. Also it can be solved at higher levels to generate more effective scheduling plan that do not only benefit consumers but also the utility company<sup>21,22</sup>.

#### *Integration of distributed energy sources*

Renewable energy generators are being integrated into today's power grid because of environmental reasons, climate change, and its low cost. This reduces emissions of greenhouse gases that rises the Earth temperature. In recent years, many governments, organizations, and individuals started to install solar cells and wind turbines to satisfy part of their power requirements. Germany for example plans fully fulfill their power demands using renewable energy sources by 2050<sup>23</sup>. Renewable energy suffers from available which has lead to high improvements in storage technology. IoT technology uses wireless sensors to collect real-time weather information to help in predicting the energy availability in the near future. Accuracy of the forecasted power amounts during the next time intervals is crucial for energy scheduling models<sup>24</sup>. Different strategies and optimization solutions have been developed in research to efficiently manage renewable energy sources withing the smart grid<sup>15</sup>.

#### *Integration of electric vehicles*

Electric Vehicles (EVs) are used as energy storage devices while they are idle. Also they provide efficient and clean transportation services. Developing efficient scheduling techniques for charging and discharging of electric vehicles can potentially lead to reduce emissions, shave peak load, and increase the used percentage of generated renewable<sup>25</sup>. Perception devices collects information about electric vehicles identity, battery state, location, etc, to improve the efficiency of charging and discharging scheduling algorithms.

### **3. Big Data Management in the Power Grid**

IoT technology integrated withing in the smart power grid comes with a cost of storing and processing large volume of data every minute. This data includes end users load demand, power line s faults, network's components status, scheduling energy consumption, forecast conditions, advanced metering records, outage management records, enterprise assets, and many more<sup>26</sup>. Hence, utility companies must have the software and hardware capabilities store, manage, and process the collected data efficiently<sup>6</sup>.

The high volume data gather in smart grid is similar in size and characteristics to the concept of big data. Big data is defined as data with high volume, velocity, and variety. The sampling frequency from perception devices can make the data size very large. Data velocity reflects the required speed for collecting and processing the data. Hence, big data management and processing techniques (hardware, software, algorithms, AI, etc) can be borrowed and applied in the domain of IoT. In addition, some applications of smart grid can perform their tasks only at specific time a day, such as weather forecasting and one-day ahead of time energy distribution, which can be performed at the night of every day. However some other applications perform their tasks all day round, such as real-time applications that monitor the power grid components. This is needed to speed up energy outage recovery process and real-time response to emergent behaviors in power demands.

Even with today's development in big data processing techniques, managing of data in the smart power grid poses new challenges that are based upon the criticality of power systems, real-time response, proactive solutions, accurate predictions, and security. Hence, we address first the question of where to store the smart grid big data.

Supervisory Control and Data Acquisition (SCADA) systems are the core of decision making in smart grid. They are used to apply real-time monitoring and control over the power grid. SCADA systems collect data from sensor nodes and perception devices which are distributed over all power grids. This provides remote monitoring and control of network devices. Also, it helps in managing the power flow throughout the entire network to achieve high reliability and demand-energy efficiency. SCADA systems generally are located on local computers at the utility companies' sites. The growing size of power grids induces a burden on utility companies to keep on updating and upgrade their infrastructure to handle the growth.

The increasing number in services and capabilities of cloud computing make it a good candidate to host SCADA systems. Cloud computing is a model that enables a convenient on-demand access to a shared pool of computing resources such as network, storage, servers, applications, and services<sup>27,28</sup>. Cloud computing enterprises deliver their services to end users in three models namely, Infrastructure as a Service (IaaS), Platform as a Service (PaaS), and Software as a Service (SaaS). IaaS provides end users with operating systems, storage, network, and database services deployed within the cloud. PaaS provides end users with capabilities to deploy their applications such as programming languages and libraries that are available within the cloud. SaaS cloud provides a ready to use application for end users.

Utility companies can benefit from the storage capabilities provided by the cloud in developing SCADA systems. Indeed, it can entirely transfer SCADA systems to the cloud and utilize the processing, storage, and other IaaS services. There are many advantages for using cloud services for SCADA systems such as: pay for only what you use, better collaboration, and reduce energy cost<sup>29</sup>. On the other hand using cloud computing for SCADA systems raises security and network issues caused by the fact that the storage in the cloud is shared among several users. This makes it more vulnerable to attacks. Also the limitation on network bandwidth in some regions makes it hard for some applications to perform their tasks with low latency.

However, fog computing extends the paradigm of cloud computing to network edges so data can be processed within devices located on network edges without the need of transferring data to cloud for processing<sup>30</sup>. Fog computing is a highly distributed and low latency model which makes it a good replacement of cloud computing for developing smart grid applications.

Finally we address the question of which computing paradigm fits processing big data in smart grid. Hadoop MapReduce technique is the most frequently used tool for analyzing large historical data sets<sup>31</sup>. In MapReduce, the big data sets are divided into smaller data sets for processing. The small data sets are then processed on a number of machines in parallel using the same code. Generally MapReduce fits to be used in smart grid for static applications such as weather forecasting, one-day a head energy scheduling, and all applications that do not require real-time response. However, when it comes to real-time applications such as online monitoring, fraud detection, and self-healing, Hadoop MapReduce is not efficient. On the other hand, stream processing is considered as an ideal platform to process big data streams and sensor's data. It is designed to handle big data in real-time with a highly scalable, available, and fault-tolerant architecture. Stream processing has a great potential to be applied for data analytics in smart grids<sup>32</sup>.

#### 4. Conclusion

Internet of Things (IoT) technology is being developed along with the smart power grid to make our daily life smarter and easier. This paper discusses applications of IoT technology in the power grid along with integrating renewable energy sources to achieve sustainable energy and prevent climate change. The paper highlights the necessity of managing and storing the big data gathered from different sensors and meters in the IoT. Reliability and low latency are two objectives in a highly distributed environment such as the smart grid. Applying stream processing on fog computing architecture supports a well-designed platform for real-time applications in the smart power grid.

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