

Integration of computer engineering and wireless communication for digital power systems

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Acknowledgement

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Abstract

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Chapter 1

Introduction

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Chapter 2

Literature Review

2.1 Overview

There are many existing solutions and work done by researchers exploring the ways to construct a communication system for monitoring and controlling of solar panels. They can be separated into three categories:

- Wired communication
- Long range wireless communication
- Short range wireless communication

The wired communication requires physical cables to connect the components of the system, the long range wireless communication employs cellular network to transmit data over long distances wirelessly, and short range wireless communication utilises ZigBee to form a mesh network which covers arbitrary area.

While many literatures explored different means of communication for solar power generation system, only a few of them address how the data from solar panels can be processed more timely and efficiently. Related work in other similar fields had been reviewed which suggest the use of message queues and real-time distributed computation systems may improve the performance and usability of such a system.

2.2 Wired communication

The conventional method of monitoring a large scale solar farm is using physical cables. In this setup, a set of power converters read the current and voltage, then transmit the sensing data to the monitoring station over some physical cables. One of the benefits of using physical cables is its proven reliability that had been demonstrated throughout solar power generation systems around the world. Furthermore, physical cables have high bandwidth which enables complicated sensing data with high sampling rate can be transmitted without fully saturating the link [Shariff et al., 2015]. However, the researchers have found the lifespan of the system may be reduced due to physical cables are exposed to constant sunlight and rain [Shariff et al., 2015]. Furthermore, the signals in the cables may attenuates over long distances and counter measures such as repeater may be required.

2.3 Long range wireless communication

One of the long range wireless communication that had been studied is a GSM based communication system for solar powered street light. In this system, each street light has a microcontroller monitoring the power generation, battery status, battery behaviours, and light behaviours. Each microcontroller communicates with a remote server through Short Message Service (SMS), which is the underlying technology that enables mobile phone to send and receive text messages from or to other mobile phones. The SMS messages carries the sensing data from each street light to the remote server through a SMS gateway to be processed and stored in the database. Finally, a web console can be used to visualise the data [Siregar and Soegiarto, 2014]. The use of SMS solves a big issue that other means of communication such as Bluetooth, ZigBee, and Wi-Fi has, the lack of range. With this setup, a large area of street lights can be connected to the SMS gateway thanks to the large communication range of the underlying GSM communication system. However, the major drawback of using SMS as the underlying means of communication is the size of each SMS message must be within 160 characters [ets, 1995]. The limitation means the sensing data cannot be very complicated and detailed, which limits the capability of the system and its use cases. The

remote server also plays an important role in the communication system. It is composed of a GSM gateway that is connected to a web server, and the web server is exposed to the internet so everyone can access the visualisation of the data over the internet. The web server is also connected to a database such that the sensing data is persistent even if the web server is down [Siregar and Soegiarto, 2014]. Unfortunately, the cost estimate and the performance of such a system, and the underlying architecture of the web server are not documented in the literature. It is hard to quantitatively compare this solution to other solutions in terms of price and performance. This system is also intended to be used with street lights that have much lower density than solar panels, and the behaviour of such a system is undocumented as the number of microcontroller increases. Therefore, it is uncertain that the GSM based communication system would adapt well in a more demanding situation such as solar farm.

Another long range wireless communication system is a GPRS based communication system for solar panel monitoring and controlling. The system is designed around the concept of Internet of Things (IoT) in mind and it is separated into three layers, the sensing layer, network layer, and application layer. The sensing layer contains sensors monitoring the characteristics of the solar panel. Then, the sensing data are fetched into a microcontroller equipped with a GPRS modem. Finally, the sensing data are sent to the internet through the GPRS modem. The application layer contains advanced functionalities such as data analytics, fault monitoring, generation monitoring, and functionalities that leverage the powerful processing capabilities of the server. Between the sensing layer and application layer, the network layer bridge the two layers by providing internet access and hosting database for persistent data storage [Adhya et al., 2016]. The system utilises the GPRS cellular network, which is the primary means of communication between mobile phones in the 2000s. This technology have the benefit of covering a wide area and offers internet access with limited speed. That means, a single GPRS cellular tower can cover significantly more solar panels comparing to other wireless technologies such as Bluetooth, ZigBee and Wi-Fi. Having direct internet access also means it doesn't have to translate the sensing data from one communication system to another like the GSM based system, where data are being sent through

SMS messages and translated at the GSM gateway into HTTP messages. Unfortunately, GPRS is still very slow by today's standards with only 14kbps upload [3gp, 2020]. It imposes a substantial limit on the complexity and amount of data being sent to the server for processing. More importantly, countries worldwide had been planning on decommissioning this old means of communication before mid 2020s. Therefore a new carrier for the sensing data needs to be used. Similar to the previous literature, there is no cost estimation of such a system and no performance details were documented.

2.4 Short range wireless communication

A short range communication method that are evolving around the IoT concept is ZigBee which is explored over the recent years. Like many other communication systems, there needs to be a ZigBee gateway with internet access to forward data from the solar panels to the server and persistent data store using HTTP protocols. Furthermore, the limited communication range of ZigBee allows the the power consumption to be is very low. The researchers claim a ZigBee module can be powered by non-rechargeable battery for two to three years and it can connect up to 65000 ZigBee modules [Shariff et al., 2015]. Since ZigBee is designed for modern IoT applications, it has more than sufficient bandwidth of up to 250kbps for complicated data exchange over the network. The problem with ZigBee is its limited range of around 1500 meters with direct line of sight and the range may be reduced significantly if there are obstructions [Shariff et al., 2015]. To combat this issue, ZigBee modules have the capability to form a cluster of connected ZigBee network which allows it to cover a much wider area. The supported network topologies of ZigBee modules are Star, Cluster Tree, and Mesh Network [Shariff et al., 2015].

The star topology has a primary ZigBee module that are directly connected to all secondary ZigBee modules. Since they are directly connected to the primary module, the resources of the secondary modules such as bandwidth are completely reserved for its own communication with minimal latency. This topology doesn't increase the coverage of a ZigBee Network but it is suitable for a small cluster of solar panels to communicate with the gateway that has internet access such as

roof top solar systems [Shariff et al., 2015].

The cluster tree topology is formed by connecting many networks with star topology. The sensing data from each module are sent and forwarded to the gateway through arbitrary number of ZigBee modules assuming there exists at least one gateway within the network that are directly or indirectly reachable from the originating module. This topology enables arbitrary coverage of the communication system. The problem with this topology is some ZigBee modules that needs to forward many other modules' sensing data may easily overwhelm its available bandwidth, leading to performance degradation [Shariff et al., 2015].

Finally, the mesh topology allows each ZigBee module having more than two directly connected modules, which allowing them to form a mesh network. Similar to the cluster tree topology where the coverage is arbitrary, it also has the benefit of reducing the potential to reach bottleneck as the sensing data can be sent through many different path [Shariff et al., 2015].

2.5 Computation system

Since the lack of studies with regards to the computer system architecture used in the communication system for solar panels. System architectures for communication systems that requires similar capabilities are reviewed instead. One of the proposed system is designed for monitoring automotive manufacturing processes using IoT devices, and it incorporates Kafka, Apache Storm, and MongoDB to process, monitor, and store data in real-time [Syafurudin et al., 2018]. In this architecture, Kafka is being used as a message queue for asynchronous communication between components of the system and it employs the publisher subscriber design pattern. The pattern separates the responsibility of the system into producer and consumer where a producer generates data, assign it with a topic that consumer can subscribe to, and consumers are notified when a new piece of data from their subscribed topics is available. The Apache Storm is used for real-time processing. It is subscribed to the topics in the Kafka and react to those new data depending on the type of sensor. In general, it stores the new data into MongoDB, a persistent data storage, and publish new data to the user so data is available

as soon as it is generated and processed. The advantage of this architecture is the user can view the data in real-time whenever it is ready, whereas many other simple architectures consists of a single HTTP web server requires the user to refresh the website constantly to download new data. This enables the user to make timely decisions, and reduces the workload of the server as it only processes the data when it is available and the user doesn't querying for data constantly.

2.6 The missing piece of the puzzle

Currently, most literatures have been strongly focusing on the means of communication between the solar panels and gateway, or the computation systems that are processing the data in the background. There is barely anywork done that investigates the union of the both worlds, that is, investigating a real-time computation system that maximises the benefits of the selected means of communication with respect to the solar power generation systems. In my opinion, this is one of the most important piece of the puzzle that is missing within this problem space because:

- Lack of documentation regarding the performance meaning we cannot quantitatively compare, justify, and identify the areas of improvement.
- Lack of integration between the two research areas meaning we cannot predict if the selected combo would work together efficiently no matter how promising they are in its own right.
- Lack of cost estimate of the system meaning we have no way to tell if the proposed solution is practical and feasible.

Chapter 3

System Overview

3.1 Concept

3.1.1 Monitoring

The solar panel generates electricity and feed it into the converter after being measured by the current and voltage sensor. The converter converts the electricity from a higher voltage to a desired votlage, which can be measured again by the sensor and used to charge the battery. The sensing data consist of input current and voltage, and output current and voltage, which are fed into the microcontroller. The microcontroller has a 4G cellular modem which enables communication with the surrounding 4G cellular base station, and the internet access is provided by the gateway at the base station. That means, the sensing data can be be sent from the microcontroller to the server through the 4G cellular network. Once the sensing data reaches the server, the data is processed, store into the database, and send to the client such as a web application. The concept for monitoring is shown in the figure 3.1.

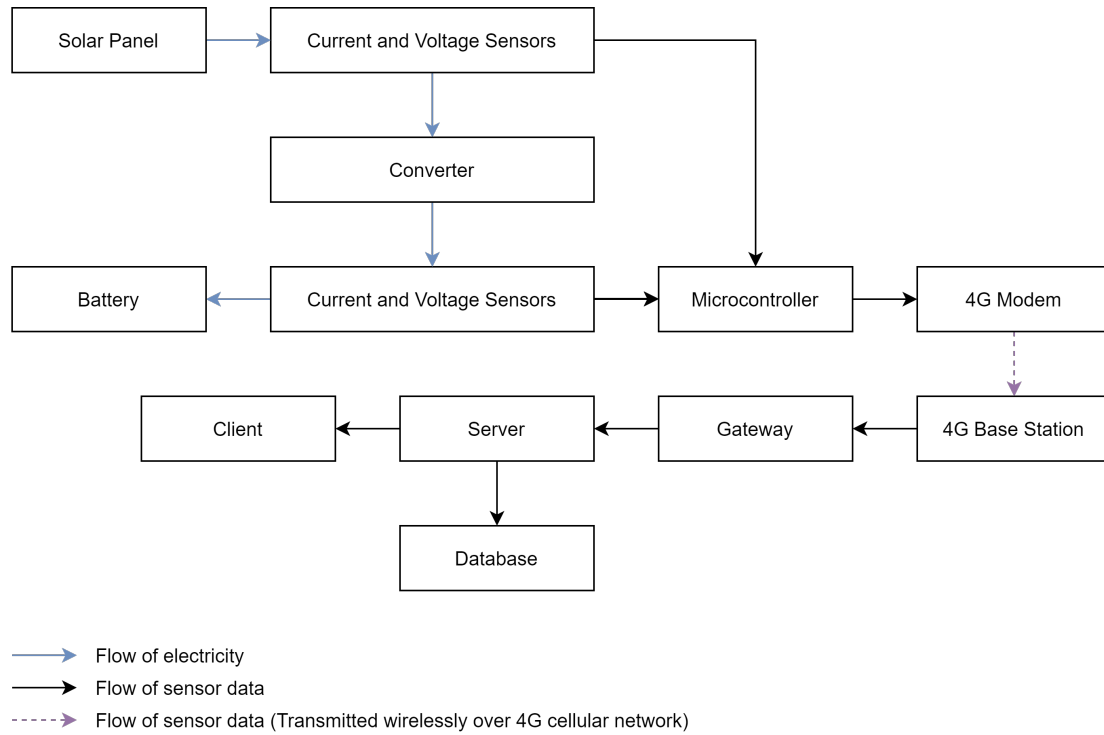


Figure 3.1: Concept of the proposed system for monitoring.

3.1.2 Controlling

The lifecycle of a command begins at the client initiated by the user. The command can be anything from setting the output voltage, to shutting down the converter. Once initiated, the client contact the server to let it know a command had been issued, and the server store it in the database.

On the other hand, the microcontroller performs periodic polling, that is, querying the server if there are new commands issued by the user every second. Similar to the monitoring, the query that is sent from the microcontroller to the server and the reply of the server that is consisting of a list of new commands are transmitted over the 4G cellular network. Finally, the commands are received by the microcontroller and the changes are applied to the converter. The concept for controlling is shown in the figure 3.2.

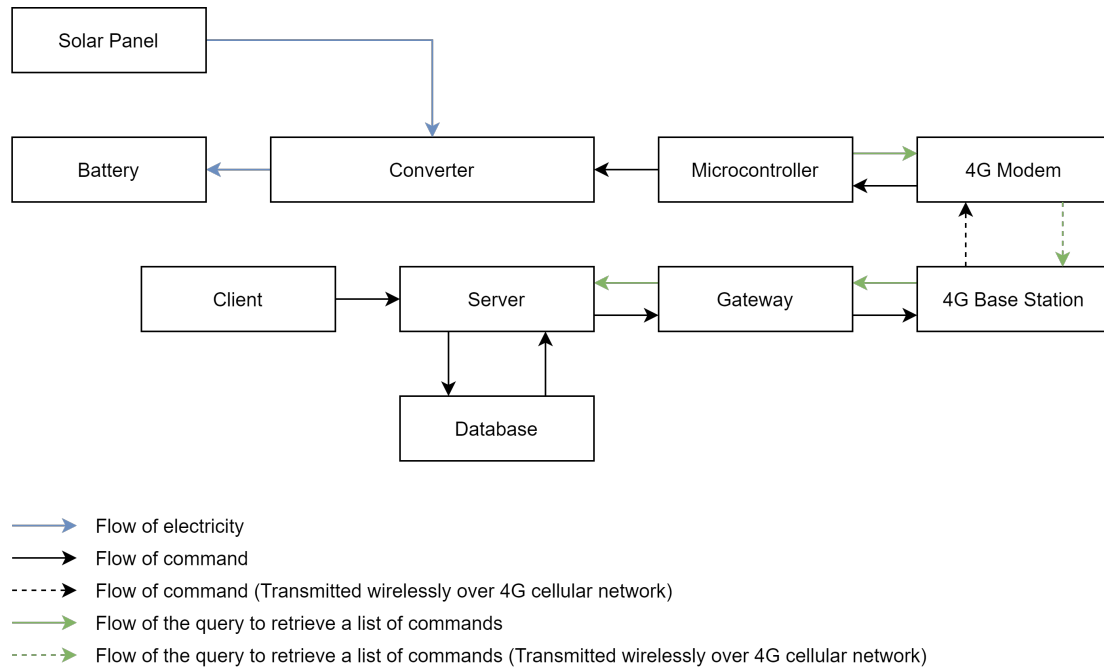


Figure 3.2: Concept of the proposed system for controlling.

3.2 Component compositions and responsibilities

The proposed system is composed of five layers separated by responsibilities. They are:

- Storage Layer
- Server Layer
- Relay Layer
- Simulation Layer
- Sensing Layer

The storage layer is responsible for storing the state of the server and sensing data received from the microcontrollers. The server layer is where the data processing logic, system monitoring, and data visualisation services are located.

The relay layer contains the 4G infrastructures and providing internet access to 4G enabled devices. The sensing layer is responsible for measuring the data and control the generation of power. Lastly, the simulation layer is used to simulate the behaviours of the sensing layer for benchmarking purposes. Figure 3.3 shows the layers and the components within each layer.

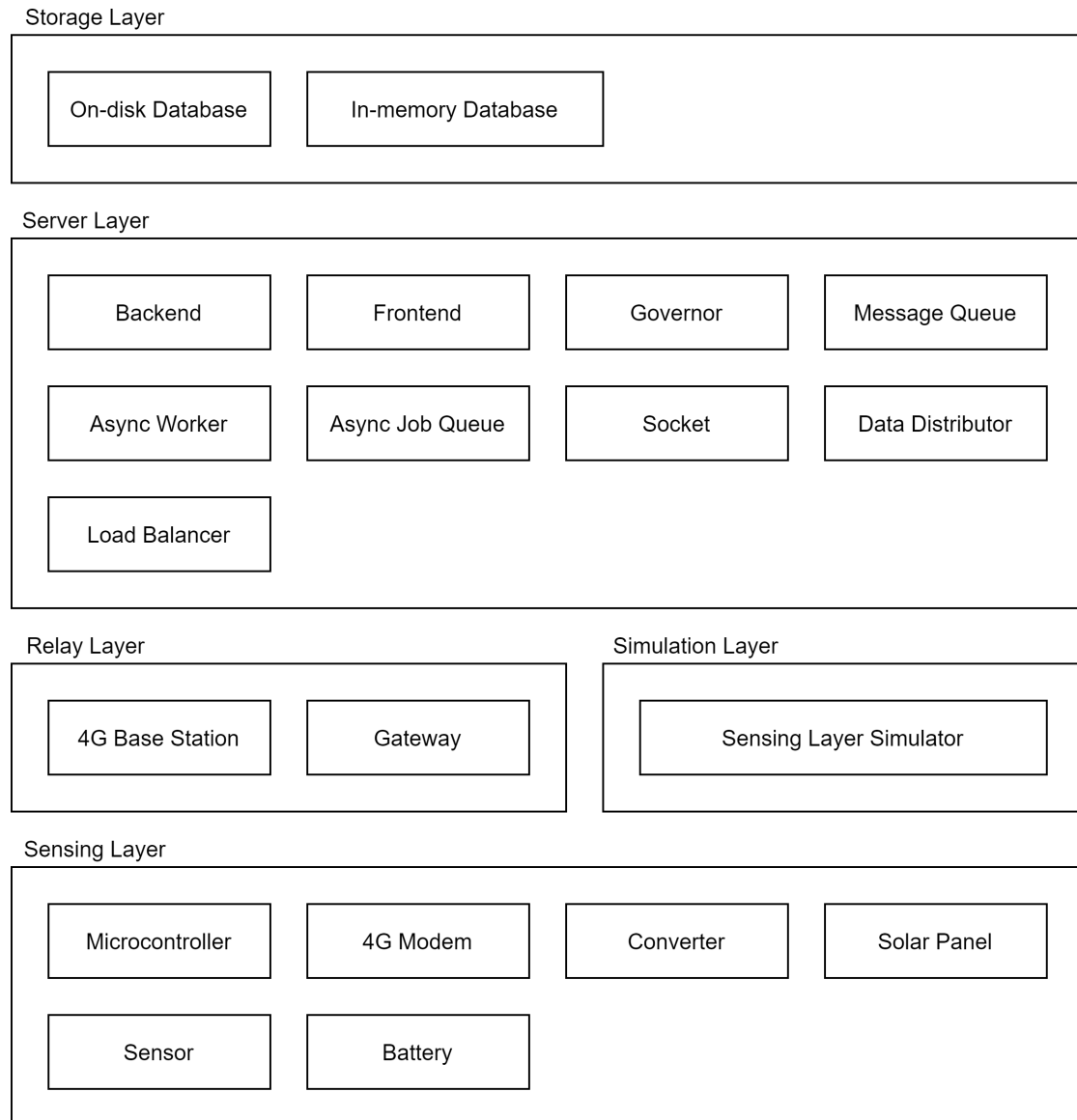


Figure 3.3: Layers and components of the proposed system.

3.2.1 Storage layer

On-disk database

The distinguishing characteristic of this type of database is the data that are stored in the database is persistent, which means the data remain intact even if the database is down due to failures. It is usually used to store a large amount of data reliably. The downside of using an on-disk database is the response time of querying and inserting data into the database can be very slow. The primary usage in the proposed system is storing the information, status, and sensing data of a device such as a solar panel persistently.

In-memory database

The goal for this type of database is not storing the data persistently but aiming to access, modify, and insert data as quick as possible. This advantage is the result of using the memory instead of the disk of the server, which is significantly faster. However, it also comes with the problem of having significantly smaller capacity, and the data is volatile. That is, the data is gone when the database is down and the data may be purged if the memory of the server is running low. This is primarily used to synchronise the state and sharing data between backend instances that are running on the same server.

3.2.2 Server layer

Backend

Backend is a stateless HTTP server and its responsibilities are:

- Providing application programming interface (API) for microcontrollers to register itself, insert sensing data to the database, and retrieve issued commands.
- Providing API for frontend to retrieve data for visualisation and notifying a command had been issued.

- Providing context-aware load balancing for frontend's real-time data visualisation.

Frontend

Frontend is a web application and its responsibilities are:

- Providing a pleasant and usable user interface.
- Providing a real-time data visualisation.
- Providing a control panel for issueing commands.

Load balancer

It is a piece of software that distribute the incoming requests to the backend instance with the least amount of load. It also uses multiple threads to serve the frontend web pages to improve the performance under load.

Governor

The governors are daemons for house keeping. That is, they are processes that are running in the background of the server and performing some predefined tasks periodically. There are only two governors in the proposed system. The first governor is called data aggregation governor and its job is aggregating the real-time data every minute. The second governor is called liveness monitoring governor and it checks if a device is publishing sensing data normally or timed out unexpectedly.

Message queue

This is an asynchronous communication system between the components of the server layer. The main contribution of the message queue is enabling processes such as backend, governor, and data distributor to communciate with each other despite they are completely separate programs.

The message queue is asynchronous because the originating process can send a message and continue to perform other tasks without waiting for the message to

arrive or a reply is received. As oppose to synchronous communication, where the originating process would stop doing any work and waiting for a reply to receive before continuing.

Async job queue and worker

The asynchronous job queue is a queue of tasks to be executed in a first in first out fashion, and the worker is a thread that takes a job from the queue in order and actually execute them. The backend is using this mechanism to process lengthy but not time sensitive tasks such as inserting data into the database to improve performance. Similar to the message queue, the originating process adds a job to the queue and it continues to perform other work without waiting for the work to finish.

Socket

Socket is the key to efficient real-time communication between the backend and the frontend. This is the enabling tehcnology which allows the frontend to wait for new data to be available as opposed to letting the frontend asking for new data every second, which is very inefficient.

Data distributor

The data distributor sits between the frontend and the backend during the real-time communication. Its purpose is reducing the load of the server by lazy loading the new sensing data at most one time, and publish the data to the frontend instances directly.

Without the data distributor, the frontend instances would be notified a new data is available, and all frontend instances would query the backend for the same piece of data, causing the backend to be accessed directly proportional to the number of frontend instances. By using the data distributor, it allows the total backend access for each update to be at most one time regardless of the number of frontend instances.

3.2.3 Relay layer

This layer contains two key infrastructures, the 4G base station, and the internet gateway. The 4G base station allows 4G enabled devices to communicate with it and forward the data to its internet gateway so that devices can access the internet wirelessly.

3.2.4 Sensing layer

This layer contains power generation devices such as solar panels, power converters, and batteries in our experimental setup. There are also monitoring devices such as sensors that are attached to the input and output of the converter and sends analog signals to the microcontroller. Then, the microcontroller process those signals and send the data to the server over the 4G cellular network using the 4G modem.

3.2.5 Simulation layer

This layer is used for benchmarking as it can generate any number of virtual solar panels and push simulated data to the server. This enables the performance and characteristics of the system to be measured and this layer should behave identical to the sensing layer from the server layer's point of view.

3.3 Hardware

The table 3.1 outlines the hardware that had been used in the system. Details of each hardware can be found in the subsections below.

Table 3.1: List of hardware in the proposed system.

Type	Hardware Model
Benchmarking server	Custom Built Desktop (See subsection 3.3.1)
Deployment server	AWS EC2 T2-Medium
Microcontroller	Nuvoton M263A
4G Modem	Quectel EC25
4G Antenna	Antenova SRFL029
4G Base Station	Depending on the service provider
Gateway	Depending on the service provider
Converter	Morningstar PS-MPPT-40M
Sensor	ACS723 and ACS724
Battery	Sun Xtender PVX-890T

3.3.1 Benchmarking server

This is the server that is being used to benchmark the proposed communication system. The hardware specification is detailed in the table 3.2.

Table 3.2: Hardware specification of the benchmarking server.

Name	Specification
CPU	AMD Ryzen 3800X (8 Core 16 Threads at 4.3 Ghz)
GPU	Nvidia GTX 1080Ti
Memory	16GB 3200Mhz
Disk	4TB HDD + 512GB SSD

3.3.2 Deployment server

This is the server that is hosted on the AWS cloud computing platform and it is used to deploy the proposed system so that it can be accessed publically. The hardware specification is detailed in the table 3.3. Note that it is not neccessary to deploy the proposed system to a powerful cloud server as there is only one solar panel used for real-world testing.

Table 3.3: Hardware specification of the deployment server.

Name	Specification
Instance Type	T2.Medium
CPU	2 Cores
Memory	4GB
Disk	32GB

3.3.3 Microcontroller

The selected microcontroller is Nuvoton’s M263A. The critical features for this microcontroller that are relevant to the proposed system is shown in the table 3.4. See figure 3.4 and 3.5 for additional details of the microcontroller.

Table 3.4: Critical features for Nuvoton M263A

Criteria	Specification
CPU	ARM Cortex M23 64MHz
APROM Memory	512KB
SRAM Memory	96KB
LDROM Memory	4KB
Has PWM Pins	True
Has Analog Pins	True
Has SIM card slot	True
Has 4G modem support	True

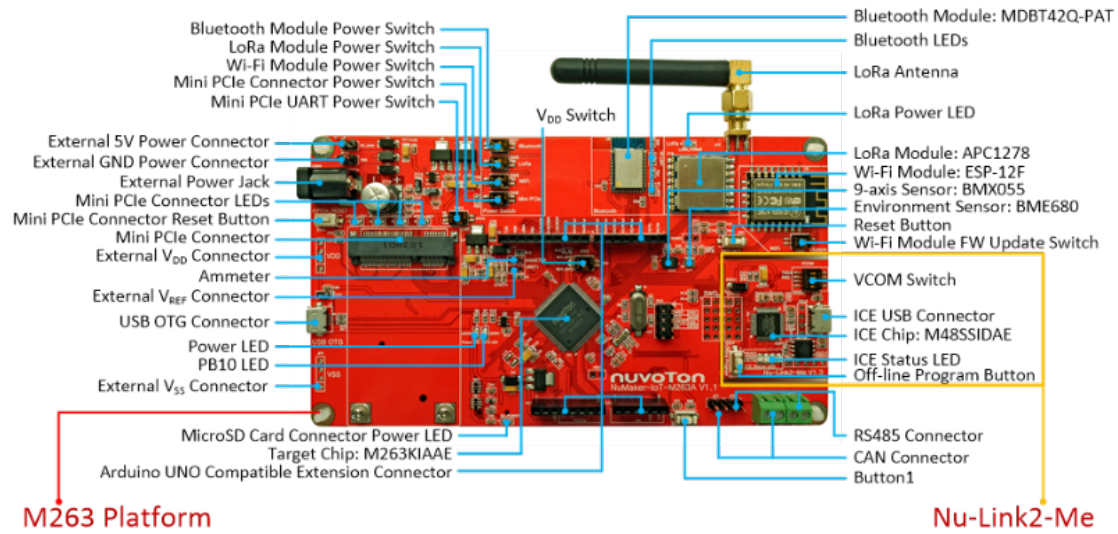


Figure 3.4: Nuvoton M263A (front) [Nuv,]

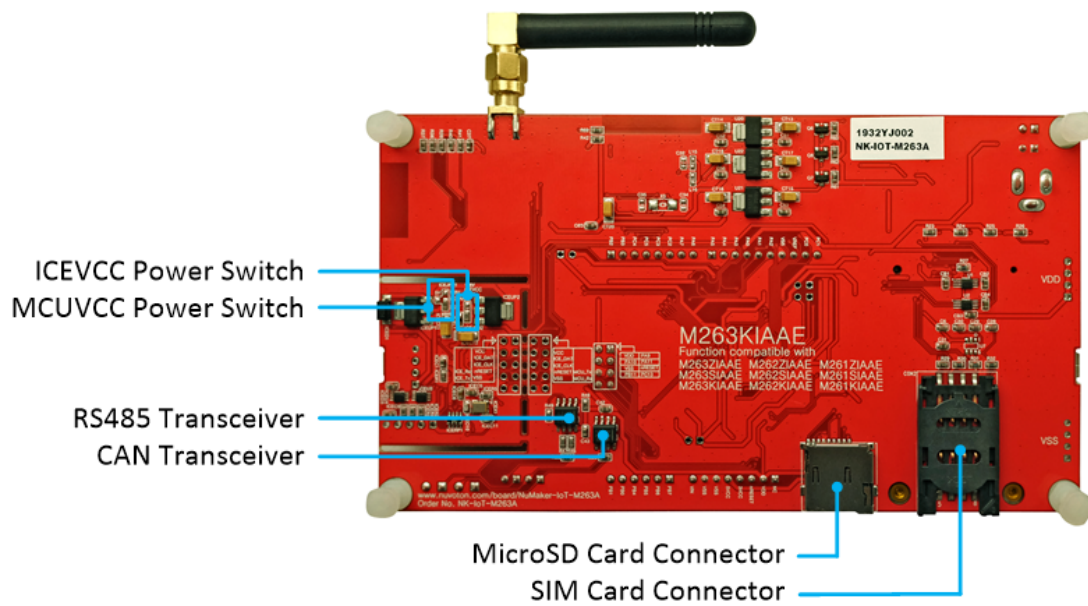


Figure 3.5: Nuvoton M263A (back) [Nuv,]

3.3.4 4G modem

The selected LTE module is Quectel EC25. The hardware specification is shown in the table 3.5 and the figure 3.6 shows the LTE module.

Table 3.5: Hardware specification of Quectel EC25

Feature	Specification
Form factor	mini PCIe
Downlink	150Mbps
Uplink	50Mbps
Has LTE	Enabled



Figure 3.6: Quectel EC25 [Que,]

3.3.5 Converter

The converter used in the real-world testing is the Morningstar PS-MPPT-40M. The hardware specification is outlined in the table 3.6. Note that the proposed system is designed to be generic such that any converter would work similarly with the system.

Table 3.6: Hardware specification of Morningstar PS-MPPT-40M

Feature	Specification
Max Battery Current	40 Amps
Load Current Rating	30 Amps
Nominal Battery Voltage	12V or 24V
Peak Efficiency	98%
Battery Voltage Range	10-35 V

3.3.6 Voltage and current sensor

There are two sensors that are being used to read the voltage and current. The ACS723 shown in the table 3.7 is used to measure the input voltage and current, while ACS724 shown in the table 3.8 is used to measure the output voltage and current. Note the input voltage and current are referring to the voltage and current of the electricity flowing from the solar panel to the converter, and the output current and voltage are referring to the voltage and current of the electricity flowing from the converter to the battery. Additionally, the proposed system should work with any sensor with analog output as long as the parameters in the microcontroller are properly set.

Table 3.7: Technical specification of ACS723 sensor

Characteristic	Specification
Sensitivity	Typ. 400 (mV/A)
Zero-Current Output Voltage	Typ. $VCC * 0.1$ (V)

Table 3.8: Technical specification of ACS724 sensor

Characteristic	Specification
Sensitivity	Typ. 100 (mV/A)
Zero-Current Output Voltage	Typ. $VCC * 0.5$ (V)

3.3.7 Battery

The battery model used in the real-world testing is Sun Xtender PVX-890T. The technical specification for the battery is shown in the table 3.9.

Table 3.9: Technical specification of Sun Xtender PVX-890T

Characteristic	Specification
Nominal Voltage	12 Volt
Ampere Hour Capacity @ 24 Hour Rate	89
Bulk/Absorb Charge	14.2-14.4 Volts
Float Charge	13.2-13.4 Volts

3.4 Software

The table 3.10 outlines the software that had been used in the system and their responsibilities are outlined in the section 3.2.

Table 3.10: List of software in the proposed system.

Component	Software
Benchmarking operating system	Ubuntu Desktop 20.04 LTS
Deployment operating system	Ubuntu Server 20.04 LTS
Microcontroller platform	Mbed OS 15.5
Message queue	RedisMQ
Job queue and worker	RedisRQ
Frontend	ReactJS and nivo.rock
Backend	Python Flask
Socket	socket.io
Load Balancer	nginx
WSGI Server	Gunicorn
On-disk Database	MongoDB
In-memory Database	Redis
Programming language	Python 3.6

3.5 Cost estimate

asdfsadfasdfasdfsdf

Chapter 4

System Architecture

4.1 System Composition

4.2 Backend

4.3 Database

4.4 Frontend

4.5 Governor

4.6 Realtime

4.7 Microcontroller

4.8 Simulation

Chapter 5

Benchmark

5.1 Setup

5.2 Procedures

5.3 Analysis

Chapter 6

Real World Testing

6.1 Setup

6.2 Procedures

6.3 Analysis

Chapter 7

Conclusion

7.1 Implications

7.2 Future work

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