

COST EFFECTIVE ELECTRICITY THEFT DETECTION USING IOT

Ujjwal Kumar^{#1} Shivank shikhar Tripathi^{#2} Paras Sangwan^{#3} Kaushal Kumar^{#4}, Mr. Satyajeet

Department of Electrical engineering

*JSS Academy of technical education Sector 62 Noida UP
India*

Abstract— The project aims at providing a state of the art technology to counter the illegal and immoral act of energy theft by domestic consumers. Theft in the development countries cost a heavy toll on the revenue generated that amount to thousands of crores of currency.

Electricity theft is one of the major challenges faced by the power companies. It prevents the power companies from making adequate money from the sale of electricity. This paper presents the development of a cost effective electricity theft detection and prevention system using the Internet of Things (IoT) technology.

Internet of Things (IoT) is making next transformation within the world of web. It provides intelligent amenities to the society. India is also not lagging behind to make use of IoT technology and because of this more cities are becoming smart in the country. Even though, 70% population in Indian towns is facing many challenges like garbage management, electricity and water supply. Electricity board in the township has many issues to provide the service at the expected level. One of the major issues is related to electricity losses which are of two types, technical and non-technical losses. Technical losses happen due to properties of materials utilized in transmission and dispersion system. Non-technical losses are electricity theft which includes tampering meters, unpaid bills, electric line tampering. Majority of the meter tampering issues have been resolved by taking smart meters into the picture but the line tampering issue still persists. The steps to solve line tampering problems include placing smart meters by removing lines which is exorbitant and time consuming. Thus, the paper provides unadorned and efficient way to solve the problem by IoT to detect the amount of electricity theft. There is provision for automatic cut of power using Arduino Uno and ATmega 328 when lines are connected in parallel, the electricity received is more than provided. Theft location is reported to the admin via sms using ESP8266 WIFI module. These things are monitored and managed by admin from remote place on the application to save the investigation time, energy, cost in a most efficient way possible. The results obtained are the comparisons between current v/s time with and without tampering. Also, the cost recurred when tampering is avoided. For the prevention of meter tampering an IR sensor is used for sensing any kind of tampering in the energy meter by infrared rays.

Keywords—IoT, Line Tampering, Detection, Prevention, Electricity Theft

I. INTRODUCTION

Electricity is one of the basic needs of population. In the current scenario many villages are facing the problem of electricity. India's electricity theft costs around loss of \$4.5 billion. If we can prevent the theft of electricity then we can easily provide electricity to every corner of country. Electricity theft is done by means of tampering Either "METER" Or "LINE".

We are going to prevent this theft using ARDUINOs and IOT technique so that whenever there is any detection of theft, distribution to that location will be stopped for that instant. The previous project consists of two energy meters for a residential load.

The slave meter will be in access of consumer but not master meter. Both the meter records the energy consumption. In case of any theft the slave meter will show the error reading but the master one still show the correct reading as it cannot be tampered. The microcontroller sense the readings of the two meters and in case of any difference it will instruct GSM module attached to it to send a message to regulatory authority regarding the theft and its location.

II. LITERATURE SURVAY

The first paper on theft issue was published in year 1995 by UK department of electricity. It talked about the ways, types and physical solutions for it. And it represented some acts and laws for theft prevention.

The methods used for detection of theft are as follows-

- Outside sources
- Information from general employees
- Specific directed efforts

By these methods they estimated the loss by theft.^[1]

Another paper we studied was published in year 2004 in IEEE Africon. It talked about study conducted to determine the optimum stationary time period for detecting electricity theft in the areas based on available consumption data in the area. This paper discusses simulations and models based on data from pre-paid meters in order to determine the feasibility and method of operation for B remote check meter.

When running the simulation a time period t in months is chosen and a number of n iterations are done. This is then evaluated for each of the different configurations, by comparing the results from the experiment against the case where no electricity theft is present in the simulation. The last step is to determine whether a sweep team should be sent into the area for auditing the meters.^[2]

Another paper we studied was published in year 2010 by National Tenaga University Malsiya. This paper presents an approach towards detection of Non-technical Losses (NTLs) of Large Power Consumers (LPC) in Tenaga Nasional Berhad (TNB) Malaysia. The main motivation of this study is to assist Tenaga Nasional Berhad (TNB)

Sdn. Bhd. in Malaysia to reduce its NTLs in the LPC distribution sector. This study develops a NTL detection framework for detection of fraudulent and abnormal load consumption patterns using RMR consumption data and meter event logs. A tamper proof system for the smart meters using IoT technology was developed in. Although this system is applicable to both the green field and brown field approach of the Internet of Things, it utilized two separate boards, one as a controller and the other as network interface.^[3]

Another paper we studied was published in year 2017 in IEEE 3rd international conference on electro-technology for national development. This paper presents the development of a cost effective electricity theft detection and prevention system using the Internet of Things (IoT) technology.

In this work, a single board (Arduino MKR1000) performs the functions done by the two separate boards above (the Arduino Mega 2560 and the Arduino WiFi shield 101). The cost of Arduino MKR1000 is \$44.95. Comparing the total cost of the Controller and the network interface of which is \$84.95 to \$44.95 which is the cost of an amalgamated board that has a controller and the network interface together, it can be clearly understood that the cost has been drastically reduced.^[4]

Another paper we studied was published in year 2018 in IEEE internet of things journal. This paper develops an energy detection system called Smart Energy Theft System (SETS) based on machine learning and statistical models.

In this paper, an innovative Smart Energy Theft System (SETS) is proposed for energy theft detection. A Multi-Model Forecasting System based on the integration of machine learning models such as Multi-Layer Perceptron (MLP), Recurrent Neural Network (RNN), Long Short Term Memory (LSTM), and Gated Recurrent Unit (GRU) was developed as part of SETS. Additionally, a statistical model called Simple Moving Average (SMA) was also further developed into SETS. These algorithms enable SETS to efficiently detect energy theft activities.^[5]

Another paper we studied was published in year 2019 in IEEE transaction on smart grid. This letter introduces a gradient boosting theft detector (GBTD) based on the three latest gradient boosting classifiers (GBCs): extreme gradient boosting (XGBoost), categorical boosting (CatBoost), and light gradient boosting method (LightGBM). While most of existing ML algorithms just focus on fine tuning the hyperparameters of the classifiers, our ML algorithm, GBTD, focuses on the feature engineering-based preprocessing to improve detection performance as well as time-complexity.

This letter presented a SG theft detection algorithm, called GBTD, based on the three GBCs (XGBoost, CATBoost, LightGBM). Out of the three GBCs, in terms of DR, both LightGBM and CATBoost outperformed XGBoost. However, LightGBM appeared to be the fastest classifier with highest FPR while CATBoost performed the slowest with lowest FPR. We also numerically proved that GBTD with feature engineering not only minimizes FPR but also reduces customer data storage space as well as processing time.^[6]

Another paper we studied was published in year 2019 in JETIR. In this paper, main purpose is to monitor the power consumed by a model organization such as household consumers, various industries etc.

Detection and control of power has been done by calculating the electricity consumed by the user with the help of meter. IOT based Power theft detection and control systems were proposed in this paper. The system would provide a simple way to detect an electrical power theft without any human interface. In this system we are looking forward to implement smart meter.^[7]

Another paper we studied was published in year 2019 in International Conference on Electrical, Communication and computer engineering, Pakistan. This paper presents the condition of electricity theft in Pakistan.

This paper presents a novel solution to tackle both meter tampering and Hooking thefts. This system is an automated system and requires no human interaction for its working once the system is installed. The proposed system provides an effective and easy way to detect electrical theft and gives effective solution for problems faced by Pakistan's electricity distribution system such as power theft on distribution line. The proposed system consists of two consumer nodes which measure the amount of power consumed and creates a load profile of the consumers. The intermediate node calculates the difference in the power values and through load profile checks for power thefts. A pre-defined limit of 200W is set as threshold for theft detection. Once a theft is detected, the prevention process disconnects all legal consumers from the line and then through the tapping transformer, high voltage is fed to the line to make illegal loads in-operational. The proposed solution is cheap and effective.^[8]

Another paper we studied was published in year 2019 by KLE Technological University. The paper provides an unadorned and efficient way to solve the problem by IoT to detect the amount of electricity theft. There is provision for automatic cut of power using Arduino Uno and Raspberry Pi3 when lines are connected in parallel, the electricity received is more than provided. Theft location is reported to the admin via sms using SIM808 module.

This chapter states the brief explanation of the issue considered, work carried out, results obtained and comparison of the work with similar works done. The work has been successfully carried out and it is better than the others in the way that it gives solution for line tampering which isn't looked upon much unlike others.^[9]

An internet of things is simply a network of internet connected objects which are able to collect and exchange data. It is invented by Kevin Ashton in 1999. In simple way we have things that sense and collect data and send it to the internet. It can be used to monitor and control mechanical, electrical and electronic systems used in various type of sectors. An system of IOT consist of sensors which talk to the cloud with some kind of connectivity, once the data gets to the cloud, software processes it and might decide to perform an action such as sending alert or automatically adjusting the sensors. Using this technology of IOT in the field power we can detect any illegal activity of power theft which is the major problem face by Utility providers.

A. Transmission And Distribution losses

Transmission and distribution (T&D) loss are amounts that are not paid for by users. Distribution Sector considered as the weakest link in the entire power sector. Transmission losses are approximately 17%

while distribution losses are approximately 50%. There are two types of transmission and distribution losses:

1. Technical Losses
2. Administration Losses
3. Non-Technical Losses (illegal use of electricity)

B. Technical Losses

The technical losses are due to energy dissipated in the conductors, equipment used for transmission line, transformer, sub-transmission line and distribution line and magnetic losses in transformers. Technical losses are normally 22.5%, and directly depend on the network characteristics and the mode of operation. The major amount of losses in a power system is in primary and secondary distribution lines. While transmission and sub-transmission lines account for only about 30% of the total losses. Therefore, the primary and secondary distribution systems must be properly planned to ensure within limits. The unexpected load increase was reflected in the increase of technical losses above the normal level. Losses are inherent to the distribution of electricity and cannot be eliminated.

C. Administration Losses

Administration losses are given by unknown connections (but not due to the illegal use of electricity) or missing meters in the network. The administration errors represent about 14% of total losses, see Fig.1.

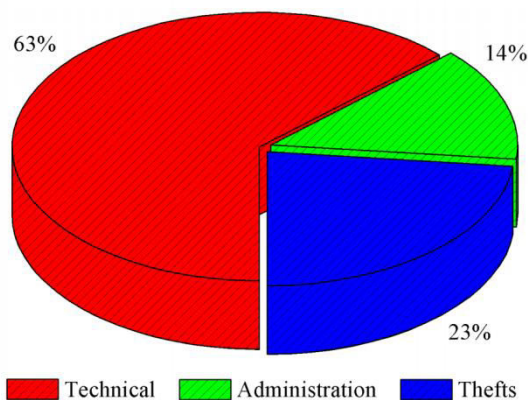


Figure 1

D. Non Technical Losses

NTLs are mainly related to electricity theft and customer management processes in which there exist a number of means of consciously defrauding the utility concerned. In most developing countries, transmission and distribution (T&D) losses account for a large portion of NTLs, which implies that electric utilities have to concentrate on reducing NTLs prior to reducing technical losses. NTLs generally include the following activities:

- 1) Tampering with meters so that meters record lower rates of consumption;
- 2) Stealing by bypassing the meter or otherwise making illegal

connections;

- 3) Arranging false readings by bribing meter readers;
- 4) Arranging billing irregularities with the help of internal employees by means of such subterfuges as making out lower bills, adjusting the decimal point position on bills, or just ignoring unpaid bills.

By default, the amount of electrical energy generated should equal the amount of energy registered as consumed. However, in reality, as some power loss is inevitable, steps can be taken to ensure that it is minimized. Several measures have been applied to this end, including those based on technology and those that rely on human effort and ingenuity. Reduction of NTLs is crucial for electricity utility companies, as these losses are concentrated in the high voltage (HV) network and are most critical at higher levels in industrial and large commercial sectors such as factories. As the current method of dealing with NTLs imposes high operational costs due to onsite inspection and requires extensive use of human resources.

E. Factors that influence illegal consumers

There are many factors that encourage people to steal electricity. Of which socio-economic factors influences people to a great extent in stealing electricity. A common notion in many people is that, it is dishonest to steal something from their neighbour but not from the state or public owned utility company. In addition, other factors that influence illegal consumers are:

- Higher energy prices deject consumers from buying electricity. In light of this, rich and highly educated communities also steal electricity to escape from huge utility bills.
- Growing unemployment rate show severe effect on the customer's economic situation.
- Lower illiteracy rate in under developed communities has greater impact on illegal consumers, as they might not be aware of the issues, laws and offenses related to the theft.
- Weak economic situation in many countries has implied its effect directly on common man.
- In view of socio economic conditions of the customer, electricity theft is proportional to the tariff of electricity utilization.
- Countries with weak enforcement of law against electricity theft have recorded high proportion of theft.
- Corrupt political leaders and employees of the utility company are responsible for billing irregularities. In addition, probability that an illegal consumer steals electricity from any distribution feeder depends on the sector where the feeder is located.

F. Effects of electricity theft

Negative effects of electricity theft are severe and dangerous. Primarily, electricity theft affects the utility company and then its customers. In addition, electricity theft overloads the generation unit. Quality of supply is also adversely affected, as the utility company has no estimate or audit about the amount of electricity to be supplied to genuine customers as well as illegal consumers. This overload might result in over voltages that can affect the performance and even damage appliances of genuine customers. This huge amount of NTL might trip the generation unit, which lead to the interruption in power supply to all customers. In view of unpredicted amount of load consumption may lead to brownouts and blackouts during in the peak

load. In order to maintain good power factor and flat voltage profile along the feeders, sufficient reactive power has to be supplied in addition to the supplied electricity. Load shedding should also be done to compensate the voltage collapse during the peak load period. VAR compensation and maintenance of power factor is very difficult without complete information about the total load flow because of the theft. In energy market, utility companies expect their money back from the customers for the electricity supplied, most of which is lost by them due to the NTL. Electricity theft is a serious concern for utility companies as they are under threat of survival because of these incurring economic losses. It is evident that some utility companies in developing countries are losing about 10 to 30 percent of their total revenue, which shows that they could not invest on measures to reduce the electricity theft. These economic losses affect the utility company's interest in development of the devices in view of improving the quality of supply or for electrification process. In addition, utility companies are forced to impose excessive tariff on genuine customers as they cannot bear the total losses just by themselves. In view of these tariff irregularities, it is not ethical to make genuine customers and utility companies pay for the energy consumed by illegal consumers. Also, illegal tapping of electricity raises safety concerns like electric shocks and even the death of a person. Improper handling of the distribution feeder might pose danger to the whole community during extreme weather conditions. These wires might start sparking and may give rise to fire. People start tapping electricity from distribution feeders during scheduled power cuts.

G. Current Practices Of theft Detection

The Distribution Network Operators have made attempts to achieve the most economical operation of distribution network and distribution of energy. Therefore, electricity tampering represents additional losses and a burden for them. Nevertheless, the monetary value of tampering creates a stimulus for detection of illegal use in the distribution network. In order to decrease the amount of tampering, the DNO investigates the possibilities of active search and detection of tampering attempts. However, the current practices are usually based on measurements taken in suspected locations, subsequent analysis and evaluation of the data measured. So far, there is no automated detection system for electricity tampering.

H. The current detection methodology

Firstly, the suspected area is initially investigated (inter alia based on notice of suspected activities). Afterwards, the power quality measurements take place in order to detect the location of illegal abstraction. One of the typical phenomena observed in the distribution networks with occurring theft is the switching of large loads in periodic intervals. This pattern is typical for consumption profiles of the growing farms. The example of periodical switching of a growing farm, measured on one of the feeders on the LV side of the MV/LV substation.

The cost associated with the procurement of the Arduino Nano and Arduino WiFi Shield 101 boards is high, relative to the cost of a single board, hence; there is need for a cheaper and effective system. In, a tamper proof electricity meter with IoT technology was developed with

ATMega 328 embedded system module. This system is costly because of the cost of the ATMega 328 board relative to other embedded system boards like the Arduino. Also, the Raspberry pi is not an open source platform. The board is manufactured by only one vendor unlike other platforms like Arduino.

Hence, there is need to develop a system that will utilize an open source platform whose boards can easily be manufactured by various companies.

III. WAY TO THEFT ELECTRICITY

Theft of electricity is the criminal practice of stealing electrical power. It is a crime and is punishable by fines and/or incarceration. It belongs to the non-technical losses.

- Direct hooking from line
- Bypassing the energy meter
- Injecting foreign element in the energy meter
- Physical obstruction
- ESD attack on electronic meter

IV. METHODOLOGY

A. SYSTEM BLOCK DIAGRAM

Figure 1 shows the block diagram of the electricity theft detection and prevention system. The system simply connects the meter to the Internet so that the utility company can be aware of the status of the electricity meter, in order to determine when the meter is tampered with; hence the IoT concept.

One good thing about the system is that the controller and the network interface units are packed in a single module so as to reduce cost, associated with the procurement of two separate boards, one as the controller and the other as the network interface.

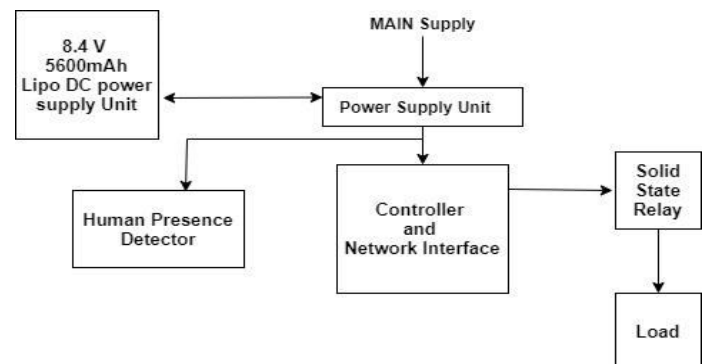


Figure 2

The system comprises of the following blocks:

A. Electricity Theft Detection Unit

For the purpose of this study, any attempt to open the sensitive part of the meter is considered a theft activity. In order to detect when the sensitive part of the meter is opened, a passive infrared sensor is chosen as the sensory element to detect the presence of a human whenever the meter enclosure is opened.

B. Controller and Network Interface

The controller coordinates the functions of all other parts of the system while the network interface is responsible for connecting the system to a WiFi network and subsequently to the Internet for data exchange.

To reduce cost, a single module is selected to act as a controller and a network interface, instead of choosing separate units for the controller and network interface. For this purpose, the bi-functional Arduino ATMEGA328 board is chosen to reduce cost and also reduce the number of components.

C. Electricity Theft Prevention Unit

To prevent electricity theft, it will be wise to disconnect the loads of a suspected electricity thief from the distribution network. A Solid state relay is utilized in connecting the load of a consumer to the distribution network in normal operation and in disconnecting the affected consumer from the distribution network, when the meter is tampered with.

D. Power Supply Unit

This block provides the entire power needed by the system to function. The 220V AC mains supply is reduced to 9V AC by a step down transformer, rectified using a pair of diodes that formed a bi-phase full wave rectifier. A capacitor is employed as a filter to remove the ripples in the signal while the LM7805 monolithic Integrated Circuit is employed for voltage regulation to produce a constant 5V DC.

Also this power supply charges the DC Backup so that when there is no power from the utility company, the DC Backup can energize the system.

E. CIRCUIT CONNECTION

As a reminder, the controller and the network interface are already connected on one board

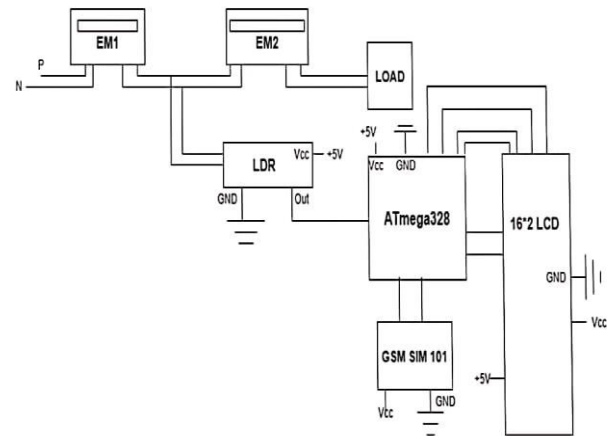


Figure 3

V. SYSTEM ALGORITHM

The following steps illustrate the algorithm of the electricity theft detection and prevention system.

1. Once the device is powered, all components will be initialized.
2. The system will connect the loads to the distribution network.
3. The system then checks if the meter is tampered with.
4. After the check, the system will update the Internet with the status of the meter.
5. The system continues to monitor the meter; once the meter is tampered with, the load connected to the meter is disconnected from the distribution network.

The Flow chart of Figure 3 represents the algorithm of electricity theft detection and prevention system. It shows the mode of operation of the system

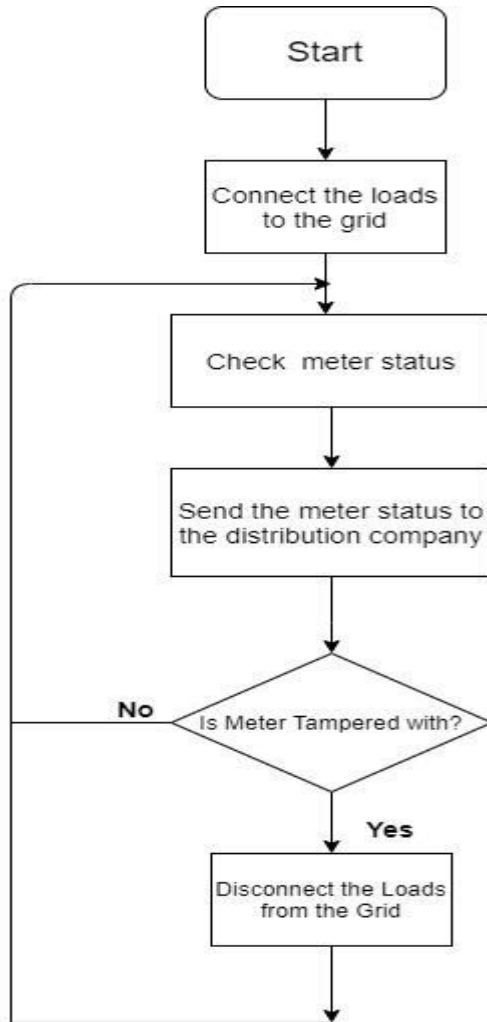


Figure 4

VI. DESIGNED HARDWARE

A. COMPONENT UTILISED

Table. 1 shows the list of major components that we used in our project along with their description and the purpose for which they were used in our project.

Components	Description	Purpose
Arduino UNO	A microcontroller based on AtMega 328. It has 14 IO pins & 6 analog input pins with operating voltage of 6v	Serial communication
Light Dependant Resistor	LDR is a commonly used photoconductive sensor	For Current sensing
Infrared Sensor	An electronic device which emits in order to sense some aspects of surrounding. Can sense upto 5m	As human sensor

LCD	A 16*2 LCD display with operating voltage of 5v	For displaying different values and information
WiFi	ESP8266 WiFi module	For establishing internet and getting real time values
Battery	12v 1.5A	For power supply

Table 1

VII. RECOMMENDATION

This study only developed a system that detects the presence of humans tampering with the meter, recommendation is made on any study that will develop a system to detect both humans and robots tampering with the meter. This is necessary because robots can also be programmed to tamper with the meter, in such a case; this system becomes almost useless.

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