

Securing Secondary Distribution with IoT-Based Smart Meters: Detection and Prevention of Power Theft

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Abstract—Electrical energy distribution faces the significant issue of losses, with power theft being a main factor contributing to these losses. This difficulty is not limited to Pakistan but is also prevalent in several other nations worldwide. This study introduces a technique that utilizes smart meters to identify the approximate whereabouts of power theft. In addition to the detection of power theft, this study also presents a mechanism for the eradication of unauthorized users. The methodology used involves comparing the overall energy with the energy that is lawfully utilized. Wireless communication systems, such as Global System for Mobile Communications (GSM) and Network Repository Function (NRF), are used for communication between the meters.

Keywords—Smart Meter, NRF based Smart Meter, Power Theft Prevention, Power Theft Elimination

I. INTRODUCTION

In recent years, contemporary technologies have transformed the global energy landscape to improve efficiency, reliability, and security. Smart grid technology relies on the Internet of Things (IoT), which has enabled several smart city innovations including object detection [1], notably in smart metering systems. Smart meters with IoT capabilities have revolutionized power usage monitoring and management. These systems focus on energy theft, which causes major economic and operational issues for utilities, particularly secondary distribution networks.

Utility companies worldwide struggle with electricity theft, or unlawful power use. Tampering with meters, creating unauthorized connections, and bypassing meters are examples. Energy theft costs billions of dollars annually, especially in poorer countries with poor infrastructure and enforcement, according to the World Bank [2]. Theft causes system inefficiencies, greater operating costs, and safety issues [3].

Real-time monitoring, data analysis, and automated anomaly reaction using IoT in smart metering systems may overcome these challenges. IoT smart meters may identify theft by sensing energy demand spikes, strange consumption patterns, or meter manipulation [4]. Data from sensors and communication equipment is analyzed by centralized management systems [5]. These capabilities help utilities

detect and stop theft, reducing losses and improving power distribution network reliability [6]. Recent study shows that IoT-based smart metering solutions reduce power theft. Zheng et al. (2020) used machine learning techniques and IoT-enabled smart meters to detect theft-related usage trends [7]. After installing sophisticated metering networks, the authors noticed a significant drop in unaccounted-for power [8]. Sharma et al. (2019) examined IoT technologies in rural and urban locations and found that they may be readily extended and adapted to diverse operating settings [9].

IoT-based smart metering systems have great potential, but they must overcome numerous difficulties to be widely adopted and successful. Protecting data integrity and privacy is a problem. Hacks and unauthorized access to personal data are concerns when consumption data is collected and sent [10]. To safeguard client data and maintain trust in these technologies, robust encryption and secure communication protocols must be prioritized [11]. IoT-enabled smart meters need large initial infrastructure and technology expenditures, which may constrain utilities' finances, particularly in developing countries [12].

Smart metering systems using IoT require appropriate legislation. The creation and operation of these systems should be controlled to safeguard data, interoperate, and consumer rights [13]. Governments, utilities, and IT businesses must work on smart metering [14]. This study demonstrates IoT-based smart metering reduces secondary distribution network power theft. These systems' communication and technology are investigated. The essay addresses implementation challenges and solutions. Research and case studies demonstrate IoT improves smart meters. List of IoT-based smart metering sensor networks, communication technologies, and data analytics platforms. Machine learning, anomaly detection, and real-time monitoring will identify energy theft [15], [16]. The best techniques and experiences from global deployments will be highlighted [17], [18], [19], [20]. Government and regulatory issues are vital for these systems' successful implementation. IoT-based smart metering may improve power distribution network security, efficiency, and sustainability. Stopping power theft helps stabilize economies and build resilient energy infrastructure [21-25].

Four periods of the Industrial Revolution. The revolution started with new energy sources powering machinery. Introducing coal mining and steam-powered facilities were important [26]. Iron and steel industries advanced throughout the second revolution, which introduced mass production and electricity. Many enormous industrial plants with assembly lines were developed, generating new enterprises [27]. After the Third Revolution automated supply chains, computers and telephone connections were implemented [28]. The Fourth Industrial Revolution will be driven by advanced robotics, 5G, and IoT [29-31].

Data, processes, devices, and people are seamlessly interconnected by the IoT. IoT measures and analyzes behaviors to improve them. Big data is gathered and processed [31]. Healthcare, urban planning, construction, agriculture, water, and energy management may benefit from IoT [32]. This is done via real-time automated decision-making and evaluation systems. Meter reading, requiring utility company personnel visits, is inefficient and limited since energy meters cannot convey customer consumption (Figure 1). In urban or difficult terrain, this strategy demands a lot of physical work, time, and logistics. Manual reading mistakes may cause inaccurate invoicing, which annoys customers and costs energy providers [31].

Remotely monitored residential metering devices may address these issues. Remotely checking house meters is possible for utilities [32]. Modern wireless, cellular, and power line communication accomplish this. Using this technology simplifies meter reading, cutting operational costs and enhancing data accuracy [33]. The authors' domestic energy management system uses fog computing, an IoT-enabled smart plug, and a smart meter. The intelligent plug calculates RMS current, frequency, power factor, active power, and reactive power. To complete [34], develop and install an IoT-connected smart energy meter. Simple, affordable, and effective meter. Energy use by electrical devices will be recorded.

Remote control exceeds meter reading. These technologies may help utilities optimize energy consumption and save energy via demand-side management. Power companies have reduced grid overloads, regulated peak demands, and promoted energy sustainability [35]. By remotely changing parameters or load shedding. E-billing streamlines paper invoicing and facilitates remote control. Digital billing reduces paper waste and improves transparency [36]. More particular, [37] notes that users may quickly obtain billing information, examine energy usage trends, and make informed use decisions. Fixing this requires a very efficient pricing strategy [33]. Each user's smart meter needs an ECC. Connecting the communication structure and electrical grid with smart meters.

Computerized billing offers dynamic pricing. These models allow utility suppliers to adjust prices based on consumption, peak demand, and energy sources [39]. Customers may actively reduce energy usage by employing off-peak hours or energy-efficient practices. Electron billing benefits utilities and consumers by encouraging energy management cooperation [40].

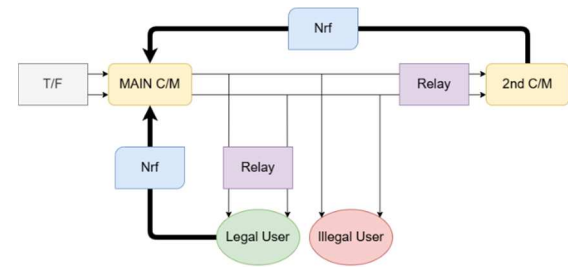


Fig. 1. Block Diagram of Proposed and Implemented Model

Remote control and automated billing enable data analytics and machine learning for utilities. Utility companies may detect consumption trends, inefficiencies, and targeted efforts to enhance service delivery and customer happiness by analyzing enormous datasets from meter readings and invoicing [34]. Analytical methods may improve operational efficiency and energy management [40], [41]. Machine learning may enhance IoT smart meter data gathering and processing [42-46]. Intelligent and sustainable energy management need these technologies [47-48].

Remote control and electronic invoicing systems provide unique issues. Data privacy, cybersecurity, and system resilience must be addressed thoroughly. To protect sensitive user data and system integrity, encryption, authentication, and access restrictions are essential [49].

II. SYSTEM DESIGN

We devised three smart meters, Two consumer smart meters (U/M) and Transformer smart check meters (T/F). In our designed system we will detect theft by installing a check meter after several connections, which will compare the output from transformer to the load. After theft detection it will send a message to the control room through wireless module NRF24101 to distribution transformer check meter shown in Figure 1.

The transformer check meter will show the total consumed units at that time. The transformer check meter will compare its output units with two consumers check meter. If the output of two consumer check meters is not equal to that of transformer output, then it will send message to control room that the theft is detected the flow chart of work is shown in Figure 2.

$$Power = V_{rms} \times I_{rms} \times \cos(\phi) \quad (1)$$

where,

$$V_{rms} = V_o / \sqrt{2} \text{ and } I_{rms} = I_o / \sqrt{2}$$

$$Energy = Power \times time \quad (2)$$

A. Consumer's smart meter

The consumer's check meter can count the consumed units by the consumer. This meter also has the ability to send consumed units to the control room through NRF. And also, in case of theft detection the control room and user smart meter will communicate through NRF.

B. Distribution transformer check meter

The transformer check meter will show the total consumed units at that time. The transformer check meter will compare

its output power with user's/consumers smart meters. If the output of two consumer check meter is not equal to that of transformer output, then it will send message to control room that the theft is detected.

III. MERITS OF PROPOSED METHODOLOGY

Smart Meter is the main building block of Smart Grid. Our modified Smart Meter devices give remote control over the individual user's energy. The updated meters will monitor user's energy meter to detect theft and then eliminate the theft, Illegal or unauthorized connection on secondary distribution line.

The proposed methodology enhances remote control and management of energy consumption through real-time monitoring and remote adjustments, providing significant advantages for users and utility companies. By enabling

immediate detection and automated alerts for energy theft after the distribution transformer, the system ensures quick response and minimizes losses. This contributes to reduced operational costs and optimized energy usage, allowing users to anticipate bills and adjust consumption patterns for potential savings. Additionally, the methodology promotes user empowerment and transparency, fostering trust between consumers and providers, while supporting energy conservation and sustainability efforts. The primary objectives are to develop remote-controlled energy meters, implement theft detection mechanisms, enhance data monitoring and analysis, evaluate cost-benefit impacts, improve user-utility interaction, and promote sustainable energy practices, thereby demonstrating the system's effectiveness in improving energy management and reducing theft.

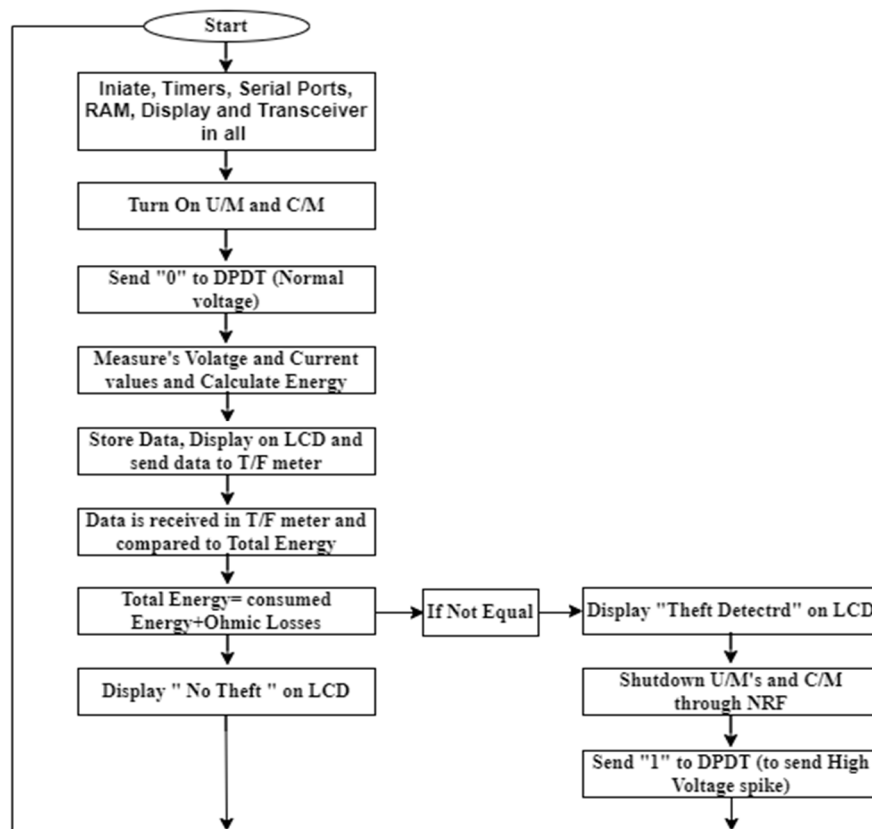


Fig. 2. Flow chart of Proposed Methodology

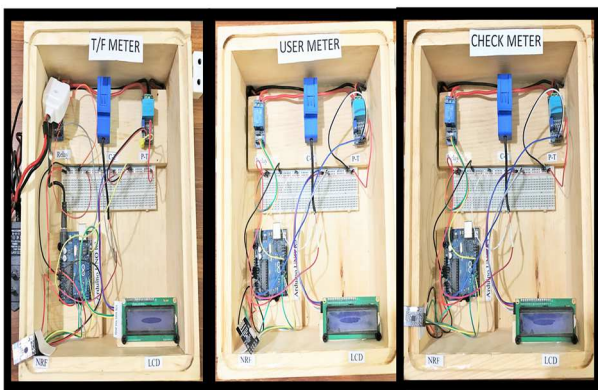


Fig. 3. Modified user's Smart meters and transformer check meters.

IV. RESULTS

In our designed system, theft will be detected by installing a check meter after several connections, which will compare the output of transformer to the sum of legal load. If the output of transformer is greater than the sum of all legal individual user's plus ohmic losses it means, there is illegal connection (theft) else no theft/illegal connection and the distribution is normal shown in Figure 5. In the case of theft detection, the transformer check meter (C/M) will send message to control room through wireless communication module (NRF24101) then after receiving message of theft/Illegal connection detection the control will send message to all legal users to switch off. After switching off all legal users (U/M), the control room will send "1" to DPDT to send High Voltage Spike to burn out/eliminate the illegal connection.

A. Theft Detection Scenario

Detection of power theft is done by the synchronization of these check meters. As discussed earlier the transformer check meter will show the total consumed units at that time and the NRF meter installed is shown in Figure 4. Therefore, when someone is trying to power theft using a wire, the extra units consumed in the form of that will be shown on transformer check meter after comparison with local consumers check meter. These readings will be sent out to the control room through NRF. Moreover, with the help of these meters, we cannot only easily detect the illegal and consumed units but can also the approximate location of power theft.

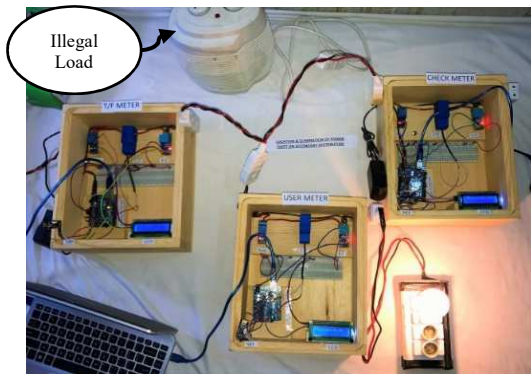


Fig. 4. Designed prototype

B. Elimination of electricity theft on Secondary Distribution

When our designed model/system locates the theft or illegal connection on secondary distribution line then from control room/ T/F meter the legal user smart meters will off, and then High voltage spike will generate by the T/F meter. It will eliminate the illegal connections/theft on distribution line shown in Figure 6.

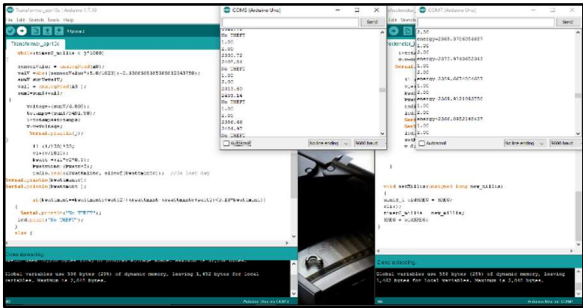


Fig. 5. No Theft Detection Scenario.

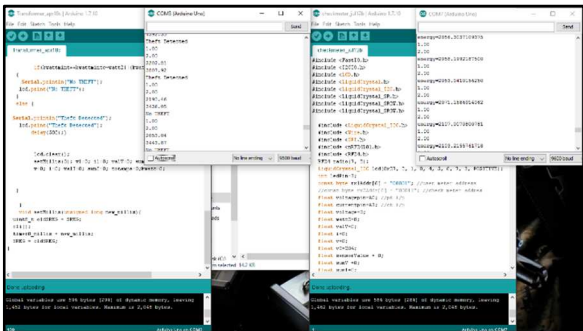


Fig. 6. Theft Detection Scenario Snapshot

V. CONCLUSIONS

With the advancement of technology, the method of electricity theft is getting advanced. Consumers are discovering fresh ways and techniques to tamper their meters. That's why the present metering system (Analog or simple digital meters) cannot fit this era especially in Pakistan. To deal with such advanced criminal's smart grid system is compulsory. The proposed mechanism interconnects the whole distribution system resulting in minimizing illegal consumption of electric energy. Besides theft detection, this article also provides an approach to eliminate the illegal consumers of electricity.

TABLE I. COMPARISON KEY FEATURES OF OUR MODIFIED SMART METER WITH OTHER METERS

Key Features	Traditional Analogue Meter	Digital Energy meter	Our Modified Smart Energy Meter
Remote Control	×	×	✓
Theft Detection	×	×	✓
Theft Elimination	×	×	✓
Distribution Transformer Over-load Protection	×	×	✓

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