



Smart Grid Technologies for Enhancing Renewable Energy Integration in Microgrids

¹ Harish V, ²Melwin Tony V, ³V Praveenkumar, ⁴Dr. Bindu B

^{1,2,3}Undergraduate Student, ⁴Professor

¹Department of Robotics and Automation Engineering,

¹PSG College Of Technology, Coimbatore, India

Abstract : The rise in the utilization of renewable energy in microgrids introduces important opportunities as well as challenges. While it advocates for sustainability and energy independence, this requires the implementation of advanced technologies and management strategies such as smart grid technologies, energy storage systems, and flexible control mechanisms, in order to provide stability and reliability. Significant obstacles to the stability of the microgrid arise from the irregular and fluctuating nature of renewable energy systems like wind, solar, and other forms. The article analyzes smart grid technologies suitable for integrating renewable energy sources, that will ensure smooth and reliable microgrid operation. We illustrate through a combination of simulation and case studies that the smart grid architecture and advanced control strategies have improved microgrid stability by better integrating RES at the aggregate level. Therefore, this system achieves simultaneous optimization of energy storage within the network and resolution of power quality issues, resulting in better overall system performance. This paper provides valuable insights to the role of green and speedy microgrids in moving us towards a low-carbon future.

IndexTerms - Energy Management System (EMS), Energy Storage System (ESS), Microgrids (MG), Smart Grid, Renewable Energy Sources (RES)

I. INTRODUCTION

The world is now taking a closer look at renewable resources due to the growing global need for energy, the risks associated with global warming, and energy insecurity. Microgrids with modern control systems, energy storage, and decentralized energy resources offer a high chance for RES integration. Systems designed to withstand main power outages make up microgrids, and these systems need an energy source that can continue to function even when the natural energy supply is unavailable. The integration of renewable energy sources (RES) into microgrids is a significant challenge due to the significant influence of RES variability and intermittency on microgrid resilience, power quality, and stability.

Smart grid technologies are necessary to achieve this goal since integrating RES (renewable energy sources) like solar and wind power into microgrids would improve the overall energy system's dependability and efficiency. They are unable to efficiently utilize solar electricity due to rigid and incompetent power grid infrastructure; hence, their reliability, efficiency, and energy losses are subpar. Recent advancements in smart grid development have made it possible for currently available technology, such as energy storage systems, sophisticated control tactics, and Internet of Things monitoring, to meet these difficulties. This study aims to evaluate how well smart grid technologies can be used to enhance the integration of renewable energy sources into microgrids, hence providing control that is robust, dependable, and efficient.

The paper is organized as follows: after **Section 1**, the existing smart grid and microgrid technologies are reviewed which is covered in **Section 2**. The proposed control techniques for RES integration are explained in **Section 3**. The discussion on the future research areas and conclusions are presented in **Section 4** and **Section 5**, respectively.

II. LITERATURE REVIEW

Moving toward resilient and sustainable energy systems currently requires integrating renewable energy sources into microgrids. Concerns about climate change are growing, and smart grid technologies are revealed to be an inventive solution in this integration process as the world's energy demand is expected to soar. In order to maximize the production, distribution, and consumption of electricity from heterogeneous sources, such as solar, wind, and hydroelectric power, smart grids make use of cutting-edge digital

communication, automation, and control technologies. More precisely, a more thorough analysis of the literature reveals that a number of technologies, such as Advanced Metering Infrastructure (AMI), Distribution Automation (DA), and Energy Management Systems (EMS), are categorized as smart grid technologies. These technologies work in tandem to increase the efficiency and dependability of microgrid operations. Using this justification, the current evaluation of the literature will highlight major trends, problems, and areas for future research in order to provide an overview of the state-of-the-art discoveries regarding smart grid technology in the expansion of renewable energy sources in microgrids.[1]

2.1 Smart Grid Technologies

The term "smart grid technologies" describes a novel method to modernize the electrical grid that combines sophisticated automation, controls, and connectivity. These technologies aim to facilitate the successful integration of solar, wind, and hydroelectric electricity into the national power pool by enabling real-time management and monitoring of power flows from generation to consumption. Distributed energy resources, Distribution Automation, and Advanced Metering Infrastructure are some of the parts that make up a smart grid.[2]

2.1.1 Advanced Metering Infrastructure:

Advanced metering infrastructure is an important piece of smart grid technology that helps utilities interact with customers efficiently. AMI is primarily composed of a network of smart meters connected to data management and communications networks that provide two-way communication and real-time exchange of energy usage data. AMI offers multiple benefits: remote management of meter readings and service adjustment without staff mobilization; dynamic pricing models that encourage customers to shift usage during off-peak hours; improved customer interaction through access to energy usage data via web portals or mobile applications; and real-time monitoring that enables utilities to react quickly and find solutions for changes in supply or demand. Some of the many advantages of AMI are as follows: enhanced operational efficiency through automated meter reading procedures; enhanced dependability through real-time identification and detection of outages; energy conservation through informed customer behaviour; simplicity in integrating renewable energy through the provision of all the data required for the management of distributed generation; and regulatory compliance through the creation of comprehensive reporting capabilities. However, AMI raises a number of concerns. These include cybersecurity risk due to the highly interconnected nature of smart grids; prohibitively high initial costs associated with infrastructure and technology deployment; concerns regarding consumer acceptance due to privacy concerns or mistrust of the potential benefits; and management issues arising from the massive amounts of data generated by the quantification of generation.

2.1.2 Distributed Automation:

Distribution Automation (DA) improves the dependability and administration of power distribution networks, which is a key component in the integration of Renewable Energy Sources (RES) into microgrids. Automated fault detection and isolation, which enables prompt discovery of problems in the distribution network, is one of DA's main purposes. This feature, which guarantees quick power rerouting when necessary and minimizes downtime, is crucial for integrating variable renewable energy sources like wind and solar. Utility companies may now dynamically manage power flow based on current conditions and ensure that renewable energy generation is utilized while maintaining grid stability thanks to automated switching devices. Additionally, DA aids in the management of voltage and reactive power, both of which are critical for maintaining power quality in a grid with increasingly distributed generation. By managing these variables, DA is able to lessen some of the problems brought on by the intermittent nature of renewable energy production. When combined with distributed analytics (DA), outage management systems offer real-time data about outages and let utilities respond more effectively, minimizing service interruptions even when incorporating variable energy sources.

2.1.3 Distributed Energy Resources:

Distributed Energy Resources are modular, decentralized energy technologies that produce, store, and distribute energy directly to end-users for example, new and increasingly moving into residential rooftops or commercial facilities. This includes solar PV systems, wind turbines, battery storage, and even EVs that can provide power back to the grid. Since DERs work on the consumer's side of the meter, there can be end-to-end local energy production and consumption that could cut dramatically transmission losses from centralized power generation. Integration of DERs in the energy system changes how electricity is generated, traded, and consumed, bringing several merits, such as improved energy reliability, lower electricity prices, and reduced greenhouse gas emissions.

DERs can enable customers to generate their own energy and also feed it back to the grid when there is an excess generation beyond what they need to consume instantly. Management of renewable resources requires appropriate management methodologies, such as energy storage solutions and sophisticated control systems that optimally manage the processes of those resources. One of the biggest challenges and opportunities with DERs is their ability to help increase resiliency across the grid, and utilities must account for these embedded resources in new operational frameworks and regulatory policies to unlock value from their potential. In conclusion, DERs play key roles in a move to a more distributed and sustainable energy network.

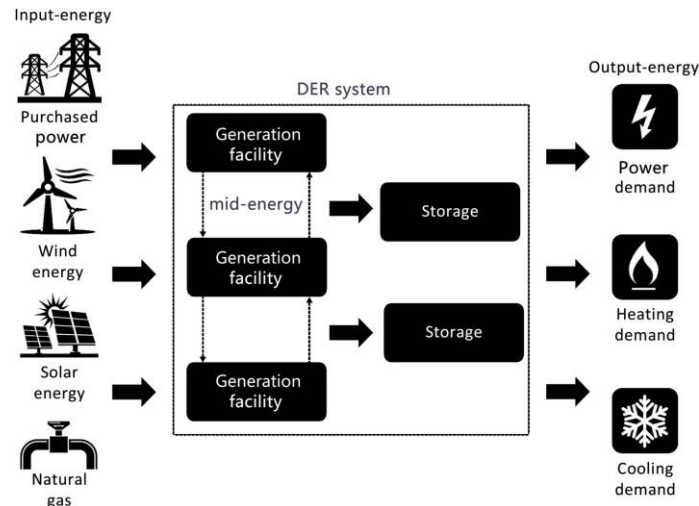


Fig. 1 Structure of a Distributed Energy Resources system [1]

2.1.4 RES Integration:

Distributed Automation integrated with Advanced Metering Infrastructure improves the optimization for RES integration by providing real-time consumption data for predicting demand in a manner that can align it well with renewable generation. DA enables automated switching devices to adjust power flows based on prevailing real-time conditions dynamically. That can stabilize a microgrid while making efficient use of renewable energy. Moreover, DA with the integration of OMS delivers real-time outage reporting which can act on such an event immediately and restore the service with the least possible interruption during one's continued output generation by renewable sources. In a nutshell, it can be said that DA plays a crucial factor in the successful integration of microgrid assemblies mainly for automating key functions enhancing reliability and efficiency while making maximum utilization of locally generated renewable energy.

2.2 Microgrids

A microgrid is, in essence, a standalone energy system; it can operate independently of the primary power network or complement the region's main power supply. Any group of solar panels, wind turbines, storage systems, or even generators would do; they are designed to serve in harmony with the support of advanced software tools and other sophisticated communication technologies. For example, microgrids may cover the energy needs of a small community like a university campus, hospital campus, corporate office park or even just an individual neighborhood. The definition of microgrid as described by the U.S. Department of Energy: "a group of interconnected loads and distributed energy resources within clearly defined electrical boundaries that acts as a single controllable entity with respect to the grid. A microgrid can connect and disconnect from the grid to enable it to operate in both grid-connected or island mode." [3]

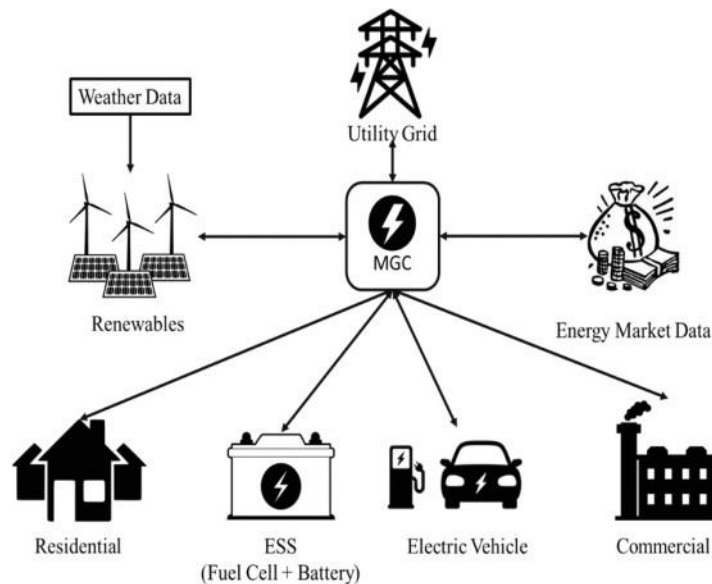


Fig.2 Microgrid Architecture [4]

2.2.1 Grid-Tied Microgrids

A grid-tied microgrid is that which ties into the primary utility grid. The microgrid can distribute power parallel to the greater grid. In this mode, there is flexibility as well as reliability in distributing power. When the generation from renewable energy sources locally exceeds demand, then the microgrid can feed the excess energy back into the grid, typically through net metering policies and collecting financial remuneration. This means that, at times of high demand or at cases of low local generation, the microgrid will

source power from the utility grid. Such dual capability increases reliability because it serves as backup power when necessary and has the potential to better resource utilization. However, grid-tied microgrids rely on the stability of the main grid because an outage or an unstable condition may require them to switch to island mode in order to continue service for local loads.[5]

2.2.2 Off-Grid Microgrids

Off-grid microgrids are those which are isolated from the main utility grid. They usually can work independently, self-generating most of their power. Often, off-grid locations have this type of system because it is not feasible or economically viable to expand traditional grid infrastructure. Off-grid microgrids ensure all their power generation is done based on local resources. For efficient supply and demand management, they often employ energy storage systems. Because they are isolated from the main grid, generation and consumption must be balanced at all times. They depend on advanced control systems, offering a range of functions including regulation of the fluctuating output from RES and the stabilization of voltage and frequency levels. Off-grid microgrids prove most important in many rural electrification strategies to improve access to energy in remote areas.

2.2.3 Operational Modes:

Both off-grid and grid-connected microgrids can function under several modes:

Grid-Connected Mode: An MG synchronized with the mains power grid in this mode is allowed to exchange electricity. While most grid-tied microgrids naturally operate in this mode under normal conditions, they may go to island mode at any time to maintain continuity during an interruption or disturbance.

Islanded Mode: When a microgrid is islanded, either through a planned event or an unplanned outage, then it operates as an islanded microgrid. In this mode, the local generation and storage must satisfy the load. Thus, transition between modes entails sophisticated control of the dynamics of power flow for stability and reliability.

While an off-grid microgrid contrasts sharply with a grid-tied one, at least in terms of its operational relationship with the main utility grid and approach toward managing energy supply and demand, a grid-tied microgrid depends on larger network advantages when it comes to reliability and flexibility, and relies on localised energy management within an off-grid microgrid.

2.2.4 Advantages of Microgrids:

i. Local Renewable Energy Generation

Microgrids can include a wide array of Distributed Energy Resources, such as Photovoltaic (PV) panels, biomass generators, and wind turbines. Using local sources of renewable energy generation, a microgrid produces electricity closer to where it will be consumed, thereby minimizing loss through transmission that would be typical for centralized power generation. For example, rooftop or community solar farms can feed clean power directly to local users thereby ensuring that communities achieve adequate amounts of renewable resources. Such an integration would reduce reliance on fossil fuels besides contributing towards achieving the carbon footprint, just as is being achieved globally.

ii. Energy Storage Solution

Other than offering renewable energy, a microgrid will frequently include an ESS in the form of a battery or flywheel. These storage systems offer the balance typically needed for variability in renewable energy sources. This means if generation from solar or wind sources happens at high levels, it can be stored and then supplied when generation is at low levels or demand increases. This feature guarantees that the microgrid power supply is stable and reliable, even in cases where renewable generation experiences fluctuation. With locally controlled energy storage, microgrids can be seamlessly operated in either of the operational modes mentioned above, providing flexibility when the main grid is unavailable.

iii. Advanced Energy Management System

This implies the application of smart grid technologies to improve the DERs and ESS operations as microgrids apply an advanced energy management system. In these systems, energy generation and consumption data is monitored in real-time, providing efficient load forecasting as well as strategies of demand response. From patterns of energy use, EMS will make decisions related to charging or discharging storage systems at the right time, how to prioritize generation sources, and when to request power from the grid or feed it back. Thus, this intelligent management improves the general efficiency of local renewable energy integration.

iv. Resilience and Reliability

Microgrids can make the supply of electricity more resilient with localized control. In the event of disturbances in the utility grid, microgrids can switchover to island mode and provide power to strategic points, for example, hospitals and emergency services, and vital infrastructure, with no interruption. This particularly proves to be useful in disaster-prone regions, where conventional grid reliability could compromise. It enables the generation and storage of renewable energy locally, thereby allowing communities to remain powered at all points of the day-even in emergencies.[6]

III. CONTROL METHODS

Techniques and methods embedded in a microgrid, which will bring renewable sources of energy to the whole grid in an efficient way by optimizing power flow, keeping it stable, and having good-quality power. The methods involved are those listed below:

3.1 Phasor Measurement Unit (PMU)

Phasor measurement is the technique used to find the amplitude as well as phase angle both in voltage and current in the electric power system[7]. This is made possible by the use of Phasor Measurement Units (PMUs), which sample data at different points of the grid at the same time. PMUs capable of capturing instantaneous voltage and current phasors depend on GPS for synchronization

of the measurements temporally. These units generate sample outputs of real-time data at high speeds whereby rates could well be between 30 and 60 per second in this process to give an outline of the condition of the grid [8].

The collected data has the following functions within the grid: It is applied for state estimation, re-stability evaluation, and oscillation or disturbance detection. PMUs have a broad range of uses; for example, it can simultaneously and continually measure voltage, current, and frequency. Furthermore, it reinforces state estimation by offering real-time data to rectify the units of the grid model to provide more accurate results. Also, it helps in the carryout dynamic stability analysis to determine how the grid moves in the presence of diverse loads or generation failures. Also, it assists in identifying fault conditions that helps in reducing the time taken for repair works hence minimizing power outages, moreover the technology actively participates in Wide Area Monitoring Systems (WAMS) these being systems that collate information from different sites for the purpose of controlling grid problems effectively[10]. Another benefit related to PMUs is in enhancement of renewable power sources balance since they have an unpredictable nature.

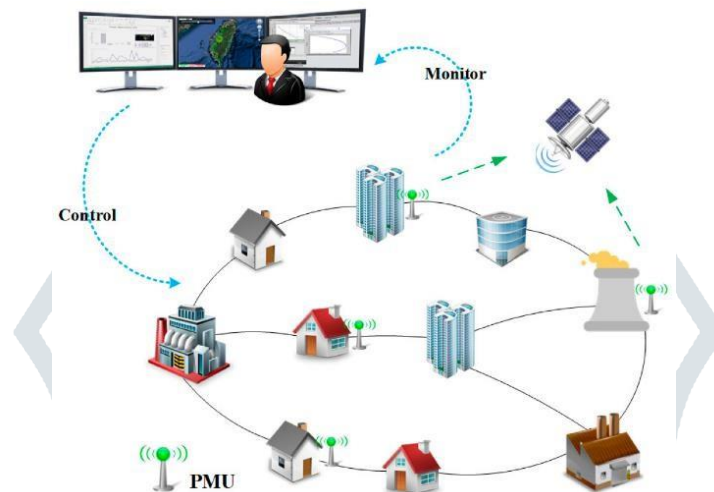


Fig.3 Pictorial Representation of Phasor Measurement Unit [9]

PMU has influence in different area of the energy domain as illustrated in next section. Especially electric power utilities employ it in an effort to improve operating performance and dependability in transmission systems. Likewise, renewable energy generation utilizes PMUs to control volatile energy generation; conversely, microgrids require the technology to facilitate coherent localized generation and consumption of power. Besides, they also enable the research institutions to model, simulate, analyse and make forecasts concerning the dynamics of the power system, which in turn supports the development of the sector.

Specifically, the installation and operation of PMUs are important to their functionality. Most often these elements are located at transmission lines and substations, which are unstable and incorporated into Supervisory Control and Data Acquisition (SCADA)[11]. They constantly send phasor data and offer a snapshot of the performance of the grid in real time. This information is then subjected to advanced analytical tools and models to obtain relevant information for implementing into the control systems for efficient grid control. The results from these analyses are sometimes presented in the form of dashboards which assists the grid operators or other decision-makers tasked with a job.

3.2 Fast Load Flow Analysis (FLFA)

Fast load flow is a process of computing a flow of power in electrical network during a very short time and it is crucial in controlling and managing smart grids. Since renewable energy is automatically integrated with the electrical grid, distributed generation systems are adopted, and innovative demand-side management methods are applied, the need for accurate and fast load flow solutions is mandatory. To solve this need several numerical methods have been found. Some of the basic iterative methods include Newton Raphson technique and Gauss Seidel method Though they are efficient methods of iterative solutions, they might slow down without optimization procedures. However, faster methods such as the Fast Decoupled Load Flow (FDLF) help to enhance convergence by providing means of more accurate computation of active and reactive power flows[12]. The Modified Newton-Raphson method is an improved form of the characteristic Newton-Raphson algorithm, made to improve its numerical speed [13].

Newton-Raphson technique is one of the most efficient techniques in solving non-linear equations which has specific application in power systems. This approach is particularly applicable to load flow studies where determination of phase and voltage levels at buses given generation and loading profiles are of interest. In general the Newton-Raphson technique is included and iterative method of solving for roots of a function where the function is approximated by the aid of its first derivative. In case of a function $f(x)$, a subsequent approximation can easily be computed from the current approximation making it fast to attain the solution.

$$X_{n+1} = X_n - f(X_n)f'(X_n) \quad [14]$$

The application of the Newton-Raphson method to load flow analysis involves addressing the non-linear power flow equations for both active and reactive power. Specifically, the equations are expressed as

- $P_i = V_i \sum V_j Y_{ij} \cos(\theta_{ij})$ for active power
- $Q_i = V_i \sum V_j Y_{ij} \sin(\theta_{ij})$ for reactive power [15],

Where P_i and Q_i represent the injected active and reactive powers at bus i , V_i is the voltage magnitude, and Y_{ij} denotes the admittance between buses i and j . To facilitate the iterative process, the Newton-Raphson method constructs a Jacobian matrix, which consists of the partial derivatives of the power flow equations with respect to the system's state variables—specifically, the voltage magnitudes and angles. This Jacobian matrix is essential for calculating the next approximation during the iterations. The iterative process continues until the differences in the calculated voltages between successive iterations fall below a predefined threshold, indicating that the solution has converged effectively.

The Newton-Raphson method for load flow analysis presents several advantages, notably its accuracy and robust convergence, particularly when the solution is near the target values. It is also applicable to large systems, making it a valuable tool in extensive power network analyses. However, there are disadvantages associated with this method. The computational burden can be significant due to the necessity of calculating and inverting the Jacobian matrix, which can increase the processing time. Additionally, the method can diverge if the initial guesses are too far from the true solution, potentially complicating the convergence process.

3.3 Weather Prediction Using ML

Previously, it has always been very difficult for the meteorological departments across the world to forecast the weather, this being due to some factors including instability of the climate. In any case, the tendency has not change, and even with all the modern means for forecast, one can seldom keep high accuracy levels to a very high standard. In the present day, weather forecasts still doubt a lot, and thus it still is an area that scientists and mathematicians invest their time trying to make results better.

In the present work, we apply the random forest machine learning approach to predict the temperature. Random forest is a supervised learning algorithm working for regression analysis through ensemble learning method. Ensemble learning is the practice of conducting more than one machine learning model and coming up with a consensus that is more accurate than any model. Out of all the algorithms, the random forest algorithm is more suitable for big data.

Random forest is relatively easy to acquire and can predict highly accurately while also providing a method to calculate the variable importance in both classification and regression. While training ANNs and SVMs training, the procedure in random forest is not challenging. The only parameter that is needed to be changed is the number of trees needed in a forest. Furthermore, the random forest model yields a shorter training time than the AI counterparts like the SVMs. By contrast, it does not abnormalize its data and is therefore convenient and efficient because it is rule-based. [16]

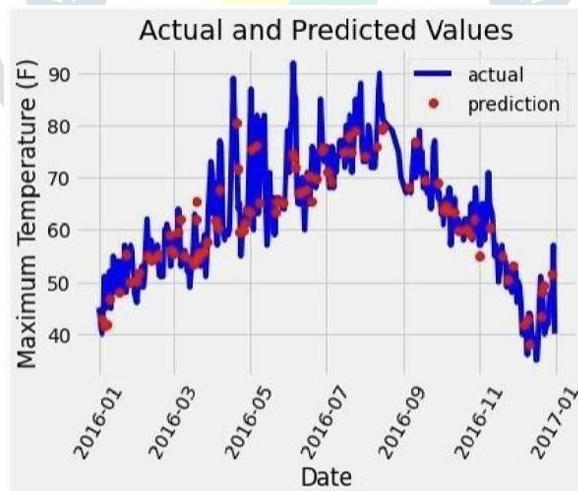


Fig.4 Actual and predicted temperature values over a particular region bi-monthly

However a final graph is created showing the actual value of the previous day's temperature, past averages, and friends' predictions. This is a great way to distinguish between useful variables and useless variables.

IV. RESEARCH AREAS

Advanced Weather Forecasting for Renewable Energy Prediction

Machine learning algorithms in localized weather prediction improve the accuracy of the scheduling of RES generation. Data from IoT sensors utilized in making forecasts reduce uncertainty and open up avenues for proactive management of the grid. Such advanced forecasting will enable far better planning and optimization of RES generation.

Smart Inverters and Power Converters for Grid Stability

Ancillary services through smart inverters support the grid in the ability to regulate voltage and control frequency. The appliances hold an important role of improving stability in the grids under highly variable RES scenarios. Smart inverter technologies can enable microgrids to deal with the variability in energy supply. [17]

Energy Storage Systems ESS Optimization and Control

Optimal advanced control algorithms for ESS require proactive charging as well as discharging cycles based on predictions made by analytical predictive models. Hybrid storage boosts the capacity and response time of the energy, which, in turn, ensures higher reliability with more flexibility in microgrids. Optimized usage of ESS aids in efficient energy storage and distribution.

Microgrid EMS and Optimization

An EMS, combined with real-time data, can strengthen the efficiency of distributed resource management. Such systems can manage load forecasting as well as real-time adjustments to maximally utilize RES. Advanced distribution and consumption of energy through an EMS is very important.

Wide-Area and Monitoring and Control Systems (WAMC)

It deployed phasor measurement units allowing them to monitor the grid across wide areas in real-time, hence enabling decisions on the status of the grid. WAMC improves situational awareness of situations and enables quick response to anomalies, thus maintaining stability within the grid.[18]

Distributed Generation (DG) and Grid Support Technologies

Encouraging local DG sources coordinated using a central management system reduces transmission losses and enhances reliability. High penetration levels of DG systems enhance energy access and resilience, providing a robust and decentralized energy infrastructure.

Cyber Security Measures for Microgrid Communication Systems

A multilayered cybersecurity framework which inhibits cyber attacks and makes sure that the data integrity is maintained. Strong encryption with continuous monitoring can ensure that the operational integrity of a microgrid communication system does not come under any threat while confidently promoting the user basis.

Blockchain-Based Peer-to-Peer Energy Trading

Develop a blockchain system for decentralized energy trading that will enhance the local energy exchange, making it economically viable and strengthen community engagement. Peer-to-peer trading is going to democratize the energy market, enabling greater penetration of RES and endowing users to better control their energy assets.

V. CONCLUSION

This paper provides solutions regarding the role of the technologies of smart grids in integrating RES into microgrids, through improvements in sustainability, reliability, and efficiency. Important solutions include advanced weather forecasting, smart inverters, optimization of energy storage, and energy management systems. Thus, these technologies circumvent issues related to intermittency, reliability, and resiliency for a strong energy framework. The research pointed out holistic and synergistic benefits for promoting innovation in energy management. The transition to a cleaner and more reliable energy future will necessitate alternative solutions and innovative business models coupled with cooperation from all stakeholders. Effective integration of RES into microgrids requires a multifaceted approach, and smart grid technologies are crucial to achieving this goal. Future research activities should focus on seeking alternative ways across these challenges as well as other new forms of business models that incentivize investment into smart grid infrastructures. Clearly, bringing stakeholders together to encourage transition to a cleaner and more dependable energy future will be essential going forward.

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