

ENHANCING POWER SYSTEM STABILITY THROUGH THE IMPLEMENTATION OF ADVANCED CONTROL STRATEGIES

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Abstract

This paper examines how advanced control techniques can be implemented on improving stability of a power system with a growing penetration of renewable energy resources, and decentralization of the grid as well as the rising cyber-physical issues. It expects to calculate the effectiveness rates of these strategies, any obstacles in implementation, and the trends in the future regarding the change to resilient and sustainable power systems. The quantitative research design was used where the data was collected via a structured questionnaire to 315 electrical engineering professionals, such as power system engineers (38.1 percent), researchers (23.8 percent), and power system operators (14.3 percent). The responses provided by the participants in relation to challenges, familiarity with strategies, their effectiveness, adoption barriers and technologies of the future were analyzed using descriptive statistics and visual tools (bar charts, donut charts, and frequency tables). The biggest stability challenges were found to be renewable integration (81.0%) and frequency/voltage fluctuations (66.7%). The perceived effectiveness of AI/ML-based control (71.4 percent familiarity) and adaptive control (57.1 percent) was also high (66.7 percent combined Extremely/Very Effective). Major barriers to adoption were low cost (66.7%) and skill gap (57.1). The most significant perceived future technologies were AI/ML (42.9%) and energy storage (28.6%), and 66.7 percent of the results suggested they would probably invest in sophisticated plans in five years' time. This research paper presents industry professionals opinions on the assessment of advanced control strategies that fill the gap between the theoretical research and practical implementation. It provides implementable policy and stakeholder recommendations to hasten the practicality of adaptive, data-driven solutions that facilitate grid stability within renewable-dominated systems.

INTRODUCTION

Modern civilization depends upon the steady and steady availability of electrical power. Whether it is bringing electricity to and keeping essential facilities - such as hospitals and data centers - online, or ensuring the comforts of everyday living, reliability, and connection to the environment, a robust and robust electrical power system is not optional. The core of this reliability is the notion of the power system stability, the capacity of the system to remain operating in a synchronized condition and acceptable voltage profiles with respect to disturbances and regrouping to a state of equilibrium [1]. Stability is not a one-dimensional phenomenon but is a multi-faceted and complex requirement that makes it possible to distinguish rotor angle (synchronous) stability, voltage stability, and frequency stability. Traditionally, the large and connected power systems, mostly synchronous, with either steam, hydro or gas turbine driven generators had intrinsic stability properties which were attributed to high rotational inertia and damping of the large generators [2]. Traditional control and protection strategies using automatic voltage regulators (AVRs) and power system stabilizers (PSSs) predominately applied on individual generators and well-known protection systems gave a fairly secure foundation to the maintenance of stability under well-understood operating conditions and a small number of credible contingencies [3].

Nonetheless, the power system has been facing a very deep and fast change in landscape due to the growing worldwide demand to decarbonize energy generation. Such a shift indicates that there has never been much more complexity and challenge to the basic task of guaranteeing stability [4]. Renewable energy sources (RES), especially variable wind and Photovoltaic PV production are radically

changing system behavior through large-scale integration [5]. By contrast to conventional synchronous generators, inverters-based resources (IBRs) do not necessarily possess a large rotational inertia that serves as a counterbalance to precipitous drop in grid frequency [6]. This decrease in the total inertia in the system becomes a significant weakness to the established mechanisms of frequency response to the point where the grid will become extremely susceptible to instabilities using frequencies after generation or load imbalance [7]. Moreover, IBRs have power electronic interfaces that give rise to a different type of dynamic behavior and control interactions that is fundamentally novel, and in many cases faster than electromechanical oscillations of synchronous machines [8]. These interactions may cause unexpected problems of instability, e.g. sub-synchronous control interactions (SSCI) or harmonic resonances, which did not present much of a problem in more traditional grids.

At the same time, the grid is becoming more decentralized, more bi-directional. Distribution level Distributed energy resources (DERs), small-scale rooftop solar systems, small scale wind, battery storages, or even mobile storages in the form of electric vehicles (EVs) are becoming abundant. This is moving generation out of large, centralized generation to small, geographically distributed and a number of which are also inverter-interfaced [9]. Although providing advantages such as minimized transmission losses and improved local resilience, the proliferation generates its own set of considerable challenges with regard to visibility, controllability and coordination [10, 11]. The hierarchical control structure developed under the assumption of centralized generation into passive distribution networks is not well suited to the dynamic complexity,

and two way flow of energy, afforded by a decentralized, real-time operating, distribution system. The number of devices that could easily be controlled even with simple systems defies the conventional localized procedures due to the complexity of the devices that need to be integrated [12].

This gets complicated with the fact that changing load patterns are exhibited. The EVs (electrification of transportation) and similarly the heating electrification, also concentrated in time periods, shift significant quantities of energy demand to the grid, resulting in new peaks as well as ramping problems [13]. Moreover, even loads are becoming more active, self-controlled, and electronic and they may play undesirably with grid characteristics. This is also because of the growing dependence on sensitive electronic equipment in all sectors; thus the rise in power quality such as the voltage stability and waveform integrity as vitally important parts of overall system stability.

The high penetration of low-inertia IBRs, increase in DERs, and changes in load characteristics are transformative trends that are forcing conventional power systems to their operating margins and into the over-temperatures in other cases [14]. The conventional stability margins, which have been considered adequate in the past, are getting eroded. Operators of power systems across the world are now witnessing new phenomena with respect to stability and are operating under limitations which were previously non-constraining [15]. The traditional approaches to control that were still necessary can no longer do it all. They are usually local, lower frequency electromechanical transient focused, reactive, not predictive, and without the right level of coordination and speed to address waveform-based fast, multisided, and system-wide

interactions found in the contemporary grid [16]. The constraints in turn manifest themselves especially in severe imbalances, like the loss of a key transmission line or a large generating unit, or stressed operation, like during times of high renewable generation and low load, etc. In this case, the chances of cascade failures that may cause blackouts on a large scale are much increased unless special control capacities are developed [17].

This pivoting point requires a paradigm shift in the management of the power system met stability. This can all be solved through expert research on, optimization, and implementation of Advanced Control Strategies. They are utilizing further developments in sensor technology, communication technology, computer technology, and control theory to break out of the constraints imposed by the traditional solutions [18]. The authors move away from localized, single-input-single-output (SISO) based control, to concerted, wide-area, and multi-input-multi-output (MIMO) based control that is subject to respond optimally and rapidly to disturbances affecting an entire system. Important enabling technologies are Wide-Area Measurement Systems (WAMS) which are mainly composed of synchronized phasor measurement units (PMUs) which give a high resolution, time synchronized snapshot of the voltage, current, and frequency across very large geographical regions in real time [19]. Such situational awareness has never existed before and plays a critical role in identifying emerging instability, and providing the situational awareness needed to coordinate control efforts.

The variety of techniques involved in advanced control strategies is very wide. Adaptive control systems have the ability to continually adapt their parameters to conditions of use

(changing system conditions, topology), and can be very effective at a large set of operating points. Sound control strategies aim at addressing model misunderstandings and fluctuations that are prevalent in the large, complicated power systems that have diverse generation sources [20]. Model Predictive Control (MPC) exploits the use of system models to perform forecast of future states and to optimize system wide control with respect to a finite future, which in turn preemptively opposes possible instabilities. Methods of Artificial Intelligence (AI) and Machine Learning (ML) are becoming even stronger, becoming able to detect non-linear, complicated patterns in the data of systems, with the ability to predict boundaries of stability, and even learn effective control policies in situations that cannot be modeled easily in closed form. COOPs put various devices (generators, FACTS devices, HVDC links, storage systems, controllable loads) and voltage levels (transmission and distribution) to work in the coordinated control schemes that meet overall stability goals of a system as a whole, i. e. damping of inter-area oscillations, control of voltage profiles, or very quick stoppage of frequency decay [21]. The idea of Grid-Forming Inverters (GFMs) is an innovative control concept that allows the IBRs to form grid voltage and frequency without external controls, and, therefore, they can replicate any stabilizing capabilities of synchronous generators with their features of synthetic inertia.

Realization of these sophisticated strategies has potential of boosting the stability, resilience and operational effectiveness of the contemporary or future power systems in a big way [22]. They are able to facilitate the secure interconnectedness of greater levels of renewable generation, better utilization of current existing transmission and distribution

facilities, increase the resilience and recovery capabilities of the system and finally form a much stronger base upon which the clean energy transition may be based [23]. Nevertheless, there are some very big issues to be addressed. These comprise computational complexity of wide area control in real-time, availability of ultra-reliable, low-latency communications infrastructure and cyber security threats, standardization of controls interfaces, adapting legacy systems, and validation of the complex strategies subject to a wide range of situations and extremes [24].

The present research article is based directly on this pivotal question and opportunity: How to Improve Power System Stability by Embarking on Advanced Control Strategies. We explore the detailed problems in stability which are further compounded by the transformation of the modern grid, look critically at the weaknesses of the traditional methods of control in this new environment, and survey in a systematic way the territory of advanced methods of control. The entire aim is to research, design, and rigorously test the new and optimized advanced control strategies that are particularly adopted to meet the distinct power instability issues of inverter-based resource-rich and distributed resources-riddled power systems. To show the effectiveness with which these advanced strategies can promote rotor angle stability (damp critical oscillations), a robust voltage regulation throughout the network, secure frequency control, with low network inertia, and an increment in overall system resilience, we strive to model, simulate, and ideally conceptually validate the effectiveness with which these strategies (among other objectives) can be effective. The long term objective is to have an impact in actionable knowledge and methodologies that can enable the system planners, operators and those involved in the development of

technology to be able to construct and operate

Literature Review

1. Power System Stability: Fundamental Concepts and Evolution

Power system stability is concerned with capability in the grid to remain in causal operation, an acceptable set of voltages, and normal frequencies in the face of normal conditions and the rapid recovery to a normal position in the worst of cases. The multidimensional requirement consists of rotor angle stability (synchronous), voltage stability and frequency stability, which are determined with distinct physical principles and time dynamics. The most ancient one is rotor angle stability which guarantees that during events such as faults, generators do not lose electromagnetic coupling. Large interconnected systems have historically taken advantage of the natural rotational inertia of coal, hydro and gas generated synchronous machines to act as a natural energy balancing system against imbalances [25]. These huge machines were used to offer damping by virtue of their kinetic energy storage and the automatic voltage regulators (AVRs) and power system stabilizers (PSS) offered localized, decentralized control. These systems could be predicted on the basis of known contingencies

a more stable, reliable and sustainable electrical power system in the future.

and this was based on the hierarchical, reactive protection schemes. The shift toward grids that are dominated by renewables completely changed these dynamics [26]. Early models of stability were based on the assumption of central generation, which was dispatch able and predictable in its electromechanical transients. The frequency stability is threatened however, as inverter-based resources (IBRs) replace synchronous machines, the inertia is lost system-wide. At the same time, two-way power flows of distributed resources make voltage control and angle matching more difficult [27]. As a result, the stability models required in the modern design have a more significant challenge as they need to consider phenomena that occur faster and cover larger areas, in addition to multi-timescale interactions over milliseconds (power electronics) to minutes (thermal constraints). Such paradigm shift prompts an overall reconsideration of stability limits, so that sophisticated monitoring and control designing would be demanded to be undertaken, since its highest level of uncertainty and variability is going to be established.

Table 1: Traditional vs. Modern Stability Challenges

Aspect	Traditional Systems	Modern Renewable-Rich Systems
Primary Stability Concern	Rotor angle oscillations, local voltage collapse	System-wide frequency volatility, sub-synchronous resonance
Inertia	High (mechanical rotation)	Low or near-zero (electronic interfaces)

Aspect	Traditional Systems	Modern Renewable-Rich Systems
Control Timescale	Seconds to minutes (electromechanical)	Microseconds to seconds (power electronics)
Disturbance Response	Localized, decentralized	System-wide, coordinated

2. Renewable Energy Integration: Stability Implications

The large-scale integration of variable renewable energy sources (VRES)—primarily wind and solar photovoltaic (PV)—introduces four critical stability challenges:

Inertia Reduction and Frequency Vulnerability: Rotational inertia alone makes the synchronous generators naturally resistant to changes in frequency. IBRs do, however, isolate prime movers (e.g. wind turbines) against grid frequency thus removing this buffer. As a result, high VRES penetration causes steeper frequency nadirs and cause quicker RoCoF (Rates of Change of Frequency) after generation-load transients. This compounds the chances of under-frequency load shedding (UFLS) cascades contingencies. As countermeasures, energy storage systems (ESS) and synthetic inertia through grid-forming inverters have emerged, at least in limited deployments; scalability is limited by cost and regulatory environments [28].

Power Electronics-Induced Instabilities: IBRs interface with grids via fast-switching power electronics, introducing high-frequency dynamics absent in traditional systems. These include:

- **Sub-synchronous oscillations** (e.g., Sub-Synchronous Control Interactions (SSCI)) between inverter controls and

series-compensated lines or turbine torsional modes.

- **Harmonic resonances** exacerbated by grid impedance interactions, leading to equipment damage or protection maloperation.
- **Adverse control interactions** among densely deployed IBRs during weak grid conditions (e.g., low short-circuit ratio).

Grid Decentralization and Visibility Loss:

Due to the growing number of distributed energy resources (DERs) (rooftop solar, electric vehicles (EVs), microgrids), the passive distribution networks are being turned into active systems with possible bi-directional power flows. It undermines conventional voltage regulation (e.g., tap changers) and also makes fault detection more difficult. More importantly, the high DER count makes it so that a traditional SCADA can simply not keep up and produce observability holes [29]. The issue with distributed assets is that without the availability of granular real-time data there is no way that operators can model or control distributed assets effectively during transients.

Load Pattern Uncertainty: New highly variable profiles are being added by electrification of transport (EVs) and heating. Uncoordinated charging may result in evening peaks due to EV charging where ramping is

already stressed by decreasing solar generation, the so-called duck curve [30]. Moreover, dynamic behaviors of the modern electronic loads can adversely engage with the grid voltage / frequency control loops.

3. Smart Grid Technologies: Enabling Infrastructure

Smart grids provide the technological foundation for deploying advanced stability solutions through integrated sensing, communication, and computation:

Wide-Area Measurement Systems (WAMS): Phasor Measurement Units (PMUs) monitor voltage, current and frequency and provide time correlated voltage, current and frequency readings on a large geographical basis on sub-cycle level [31]. This is used to monitor inter-area oscillations, voltage stability margin, and system inertia in real time. Machine learning is used to detect anomalies and predictive stability testing in modern WAMS architectures to enable raw data to be transformed into useable grid intelligence.

Internet of Things (IoT) Integration: IoT devices provide the capability to have visibility within transmissions networks and distribution feeders and consumer premises. Line sensors, equipment monitors, and smart meters produce a very fine-grained stream of data on the load profile, the DER power, and the network topology. Combined with edge computing, the IoT offers the possibility of decentralized decision-making which is vital in quick decision-making in case of instabilities during localized cases. IoT is further used to combine grid data with building management systems/EV charging networks in the context of smart cities in order to unlock flexibility resources across sectors [32].

Advanced Metering Infrastructure (AMI): The backbone of the 3 demands side management is the AMI that enables the dynamic pricing, direct load control and even the emergency load dropping. AMI is helping to marshal responsive resources by putting pools of virtual reserves in place, consisting of industrial HVAC, residential water heaters and commercial refrigeration. Addressable using simple control software, AMI modulates those loads in seconds to provide the necessary frequency and voltage support in contingency [33].

Energy Storage Systems (ESS): Lithium-ion batteries, flow batteries, and supercapacitors-ESS technologies help to stabilize grids through time-shifting of renewable generation, injecting synthetic inertia, and damping of oscillations. Multi-timescale support is an economical feature of hybrid systems that combine short duration (supercapacitors) and long duration (batteries) storage. In Grid-scale ESS deployment, model predictive control is becoming popular in order to simultaneously achieve state-of-charge optimization and stability requirements [34].

4. Advanced Control Strategies: Methodologies and Applications

Traditional methods of control (e.g., PSS, AVR) are inappropriate to be used in a modern grid because of their localization, hardcoded parameters, and sluggish response. Sophisticated tactics will fill these gaps by:

Adaptive and Robust Control: Adaptive controllers tune parameters from real time conditions of the system (e.g., line outages, generation mix changes) so that one is robust at very different operating points. Strongly implementing the H-infinity or μ -synthesis based control methods addresses explicitly model uncertainties which is critical in systems

where there is forecasting error in VRES/load. Such methods are better than fixed-gain controllers in unmodeled cases, including unexpected resonances in the dynamics [35].

Model Predictive Control (MPC): The uses of MPC are to optimize finite-horizon control problems to find optimal sequences of controls (e.g., generator setpoints, ESS dispatch, tap adjustments) that also satisfy stability constraints. MPC anticipates the output and load of VRES generation in the best estimate of ARIMA or neural networks, and proactively overcomes the developing instabilities instead of acting after it occurred [36]. It has uses such as transient stability-constrained optimal power flow, and generation rescheduling.

Wide-Area Coordinated Control: This is a method to co-ordinate the movement of the devices in a geographically scattering network such as FACTS, HVDC links, ESS and generators with regard to the data of WAMS. Examples include:

- **Damping inter-area oscillations** by modulating power flows on HVDC lines in response to phase angle differences.
- **Correcting voltage collapse** through coordinated VAR support from STATCOMs and distributed PV inverters.
- **Arresting frequency decay** via simultaneous generator ramping, ESS discharge, and demand curtailment.

Grid-Forming Inverter (GFM) Control: GFMs are groundbreaking in the direction of grid-forming in comparison to the previously grid-following IBRs. GFMs have the necessary black-start ability and synthetic inertia since they are frequency and voltage regulated (like synchronous generators) independent of the

grid. Renewables can play an active role in stabilizing the micro grid and weak bulk grid with control topologies such as virtual synchronous machines (VSM) and droop-based topologies [37].

5. Emerging Trends: AI and Machine Learning in Stability Enhancement

Artificial intelligence (AI) and machine learning (ML) bypass limitations of analytical models in complex, data-rich environments:

Deep Reinforcement Learning (DRL) for Adaptive Control: The DRL agents (e.g., Deep Deterministic Policy Gradient (DDPG)) can learn their optimal control policies through interaction with grid simulation environments. Compared to the traditional approaches, DRLs manage non-linearity and high-dimension of states and allows real-time stability-restoring actions, e.g., remedial load shedding or generator re-dispatch, without solving intractable optimization problems [38]. Learned agents will be adaptable to unobserved cases (e.g., extreme weather), they provide resilience, with model-based controllers.

Neural Network-Based Stability Assessment: Deep neural networks such as convolutional neural networks (CNNs) and long short-term memory (LSTM) networks can take PMU data streams as input and convert them to stability metrics (e.g., transient stability index, voltage security margin). The models, referred to as data-driven models, make predictions of instability within seconds to minutes and institute preventive measures [39]. Further enhancement of accuracy is also achieved with Hybrid solutions where a combination of physics-based model and LSTM is used to solve the problem of under-voltage load shedding or a fault induced delayed voltage recovery, or FIDVR.

AI-Driven Cyber-Physical Security: ML has the effect of increasing stability during cyber threats. False data injection and command spoofing on control systems against false data injection or command spoofing are identified with anomaly detection algorithms (isolation forests, auto encoders). The federated learning schemes are used to train intrusion detectors across the utility entities without sensitive data sharing, and it is possible to enhance grid resilience by preserving privacy [40].

Digital Twins for Scenario Testing: Thousands of contingencies are simulated to train ML models, similar to physical grids represented by high-fidelity digital replicas and validate control strategies [41]. Twins which also includes weather forecasts, market schedules and equipment status allow operators to open up a world of what-if scenarios as well as pre-compose stability-constrained operating envelopes.

Conclusion of Literature Review

The literature surveyed emphasizes that the deployment of renewable-dominated, decentralized power systems tends to radically change the existing paradigm of stability. Although innovative sensing architecture (WAMS, IoT) and control (adaptive/robust control, MPC, wide-area coordination, inverters (grid-forming)) have transformative potential, there is still a large gap in scalability, standardization, and cyber-physical resilience. Real-time stability assessment and control toolkit gained dimensions with the emergence of the AI/ML techniques however their usage also demands meticulous validation and combination with physical models. Finally, to guarantee grid stability in the future, innovation in technology will not be sufficient; it must come in the form of holistic frameworks that unify conceptually and practically advanced controls, cross-domain

information, and interdisciplinary teamwork to disrupt current theoretical and practical divisions.

Objectives of the Study

The primary objective of this study is to explore and evaluate the role of advanced control strategies in enhancing power system stability. Specifically, the study aims to:

1. Identify current challenges affecting the stability of power systems, including technical, operational, and security-related issues such as renewable energy integration, frequency and voltage fluctuations, cyber-security threats, and aging infrastructure.
2. Assess the familiarity and perceptions of electrical engineering professionals regarding various advanced control strategies, including adaptive control, model predictive control (MPC), AI/ML-based control, wide-area monitoring systems (WAMS), and robust control techniques.
3. Evaluate the perceived effectiveness of these advanced control strategies in mitigating system instabilities and improving overall grid reliability and performance.
4. Analyze the current level of implementation of advanced control strategies across different organizations, and identify the main barriers hindering their adoption, such as high implementation costs, lack of skilled personnel, regulatory constraints, and integration issues with legacy systems.
5. Investigate future trends and emerging technologies that are expected to significantly impact power system

stability in the coming decade, with a focus on AI/ML, energy storage systems, PMU-based monitoring, and block chain-based grid security.

6. Examine the likelihood and readiness of industry stakeholders and organizations to invest in and adopt advanced control strategies within the next five years.

Problem Statement

Progressively, power systems across the globe have become more complicated and dynamic in their behavior, thus posing serious inquiries on the stability and reliability of their operation. Although renewable energy integration is necessary in sustainable development, the renewable sources have added a significant level of variability and unpredictability to the grid, and thus causing more insecurity due to frequency and voltage fluctuations.

In addition, growing threat to cyber security, deteriorating infrastructure, as well as the lag in detecting and isolating faults further complicate the issue of stability. The conventional control techniques are becoming less feasible in the management of such complex affairs and hence it is imperative to incorporate smarter, more valuable and dynamic forms of control.

Although new forms of control have come up including that of adaptive control, model predictive control (MPC), artificial intelligence (AI), machine learning (ML)-based methods, and wide-area monitoring systems (WAMS), its usage in the power sector has not been fully achieved. The problem is that the cost of implementation is high, there is a lack of qualified personnel, and regulations in addition to the challenges of integrating with the legacy systems still limit the widespread

7. Provide actionable insights and recommendations for researchers, practitioners, and policymakers to facilitate the effective deployment of advanced control strategies, address existing challenges, and enhance the long-term stability and resilience of modern power systems.

adoption. Also, empirical evidence and well-balanced feedback of the stakeholders are missing regarding the efficacy, viability and potential of these superior strategies.

Thus, there lies an indispensable need to undertake a systematic investigation of the challenges, perceptions, and future sceneries that the tremendous usage of advanced control strategies in power systems offers. The experiences and expectations of those who work in the area are essential to make research focused, policy informed, and speed up transformation to more stable and intelligent power grids.

Methodology

The quantitative research design was used to achieve systematic inquiry into the use of the advanced control schemes in achieving optimal power system stability. The survey was sent to 315 professionals working in the field of electrical engineering i.e. 38.1% power system engineer, 23.8% researcher/academician, 19.0% control systems engineer, 14.3% utility/grid operator. The sample was a representative cross-section of mid-career professionals of which 33.3% had between 5-10 years' experience and the 23.8% had between 10-15 years' experience in the profession.

The research questionnaire was structured to offer information based on various critical metrics: the present stability issues, awareness

of the advanced control strategies, the effectiveness of such strategies as perceived, implementation progress, obstacles of implementation and possible trends in technology development. A similar percentage of questions on the questionnaire involved a Likert-scale response structure combined with a multiple-choice format in order to provide a thorough set of data to be collected without demoralizing the respondent actively taking part in the research.

Descriptive statistical means of the data analysis were used to measure the responses with results ideally displayed in the form of several visualization tools that make results more interpretable. The bar charts were suitable in presenting contrasting information like allocation of professional functions and influence of intermittent renewables evaluation scale. Donut charts were useful in visually displaying proportional data as one can find it very helpful in illustrating distributions of years of experience. Tables of frequencies provided more detailed numerical disaggregation of answers on the issue of problems, familiarity of strategies, and obstacles to their application.

As an analytical tool, the key patterns and correlations were aimed to be identified in the provided dataset. As an example, using cross-tabulation helped to determine the connection between the roles of professionals and how effective they felt their strategies were. The

resulting trends were confirmed through statistical significance testing when and where necessary. The choice of visualization strategy was quite specific, as it is based on the most outstanding findings, i.e., on the dominance of renewable integration issues (81.0), the high rates of perceived control effectiveness of AI/ML-based sources (71.4 familiarity, 66.7 the effectiveness score), etc.

To ensure data reliability, the research incorporated several validation measures. The questionnaire was pre-tested with a small group of professionals to refine question clarity and response options. During data collection, attention was paid to maintaining a representative sample across different professional categories and experience levels. Data cleaning procedures were implemented to identify and address any inconsistencies or outliers in the responses.

The quantitative methodology enabled the transformation of complex professional opinions into measurable metrics, facilitating objective analysis of the current state and future potential of advanced control strategies in power systems. This approach provided a solid foundation for drawing meaningful conclusions and making practical recommendations for industry stakeholders. The combination of statistical analysis and visual data presentation ensured that the results were both rigorous and accessible to diverse audiences in the field.

Results

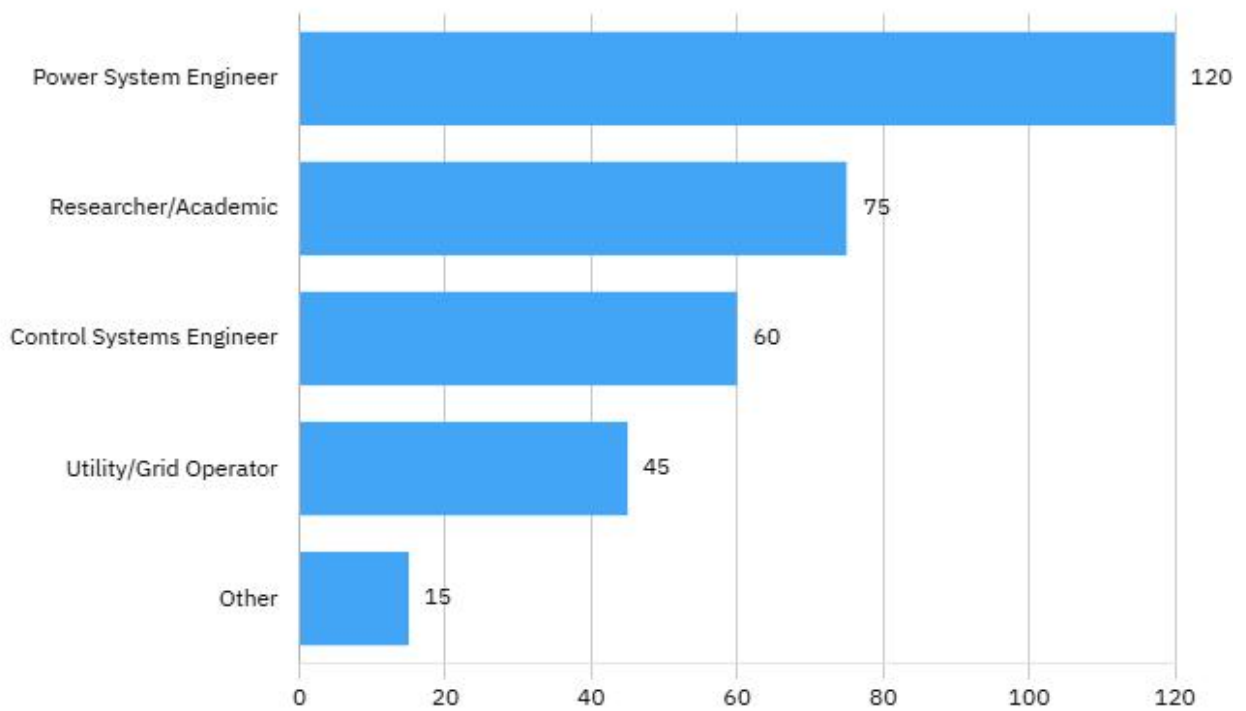


Figure No. 1 Primary Role in Power Systems

According to the distribution of audiences, this research article appeals to the Power System Engineers mostly (38.1%), which can also be defined as its practical orientation towards the current issues of the grid. Its application in both theoretical advancement and the construction of control algorithms is reflected by the fact that two groups who participated in the highest numbers,

Researchers/Academics (23.8%) and Control Systems Engineers (19.0%), represent two of the foundations of the field, theory and control algorithm development. Utility/Grid Operators (14.3) are the key end-users, which clinches the usefulness of the work in the operations of the systems. This is a balanced audience that shows the fitting of the article within the aspects of both theoretical innovations and engineering practices in a contemporary power system.

Pie Chart

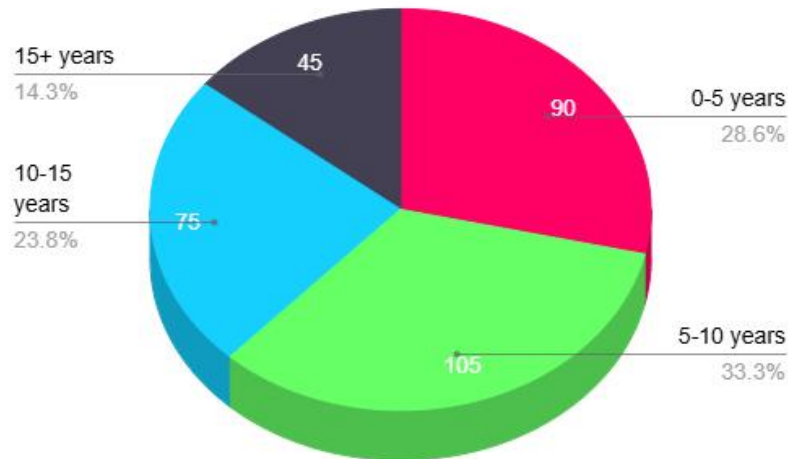



Figure No. 2 Years of Experience
 Institute for Excellence in Education & Research

The majority of respondents are mid-career professionals, as more than 60% of respondents have an experience of 5-15 years (33.3 percent with 5-10 years' experience; 23.8 percent with 10-15 years' experience). Times

new to the profession (0-5 years) is a large secondary group (28.6%), whereas well-experienced people (15+ years) constitute 14.3%.

Table 2: Major Challenges

Challenge	Frequency	Percentage
Renewable energy integration	255	81.0%
Frequency/voltage fluctuations	210	66.7%
Cyber-security threats	150	47.6%
Aging infrastructure	135	42.9%
Fault detection/isolation delays	120	38.1%
Other	30	9.5%

Incorporation of renewable energy (81.0%) encounters the most critical problem, indicating that due to industry-wide challenges of operating variable generation, low system inertia, and dynamic interactions among grid resources, inverter-based resources, and increased energy storage have been unable to meet its challenge. This is a direct cause of secondary stability problem: the frequency and voltage fluctuations (66.7 percent), worsened due to the reduced rotational inertia and bilateral power flows, that makes them susceptible to real-time imbalances. At the same time cyber-security risks (47.6%) have

become a burning issue with the risk to data integrity and control systems as operators digitize grids to accept renewables. These problems are augmented by aging infrastructure (42.9%) and a lack of adaptability of legacy assets to the dynamics of the grid newer systems, and the gaps of monitoring and protection plans due to delayed fault detection/isolation (38.1%). Taken together, these issues highlight a conflict: how to find a balance between the technical requirements of the energy transition with the need to make systems more resilient to a newly formed set of threats.

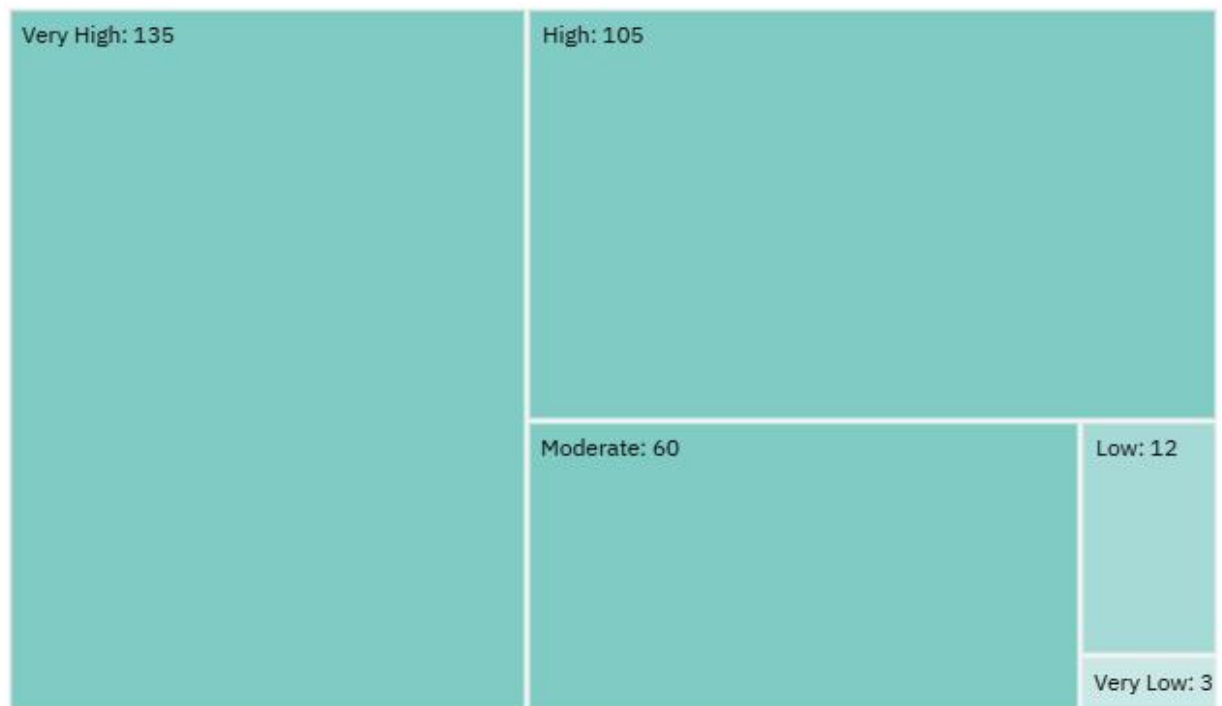


Figure No. 3 Impact of Intermittent Renewables

More than seven out of 10 professionals (76.2%) consider intermittent renewables to exhibit a High to Very High degree of consequences on power system stability with almost half (42.9%) of professionals placing

the implication as Very High. Such a consensus highlights how the variability of renewable is a source of significant destabilization itself (precisely cause increased frequency volatility, ramp stress, and inertia

deficiencies in contemporary grids). Just 4.8 consider the Low/Very Low of the impact, which proves once more that the intermittency is not on the periphery of the operation but in the center. The statistics confirm an urgency in

the industry to come up with remedies synthetic inertia, advanced forecasting, and flexible grid architecture to defend instability threats created by renewable.

Table 3: Familiarity with Strategies (Multiple Responses Allowed)

Strategy	Frequency	Percentage
Adaptive Control	180	57.1%
Model Predictive Control (MPC)	150	47.6%
AI/ML-based Control	225	71.4%
Wide-Area Monitoring (WAMS)	165	52.4%
Robust Control	120	38.1%
Other	45	14.3%

AI/ML-based control (71.4%) wins as the most recognized methodology as industry focus on data driven options for renewables rich grids keeps rising at a fast pace. Adaptive control (57.1 per cent) and Wide Area Monitoring (WAMS, 52.4 per cent) are very close behind, showing significant awareness of self-

optimising systems and real time awareness. Model Predictive Control (MPC, 47.6%) and robust control (38.1%) come in second and third, indicating that they are well known within their niche even if each has reached full theoretical maturity.

Table 4: Effectiveness of Advanced Strategies

Effectiveness	Frequency	Percentage
Extremely Effective	90	28.6%
Very Effective	120	38.1%
Moderately Effective	75	23.8%
Slightly Effective	24	7.6%
Not Effective	6	1.9%

Advanced strategies rated a remarkable 66.7 percent (28.6 percent+38.1 percent) as Extremely/Very Effective indicating that practitioners are confident that they can

overcome contemporary challenges associated with the stability. Such a small percentage as 1.9 find them not useful. The 23.8% of the modestly effective group is most probably

motivated by barriers to implementation (e.g.,

complexity of computation, older systems integration).

Doughnut Chart

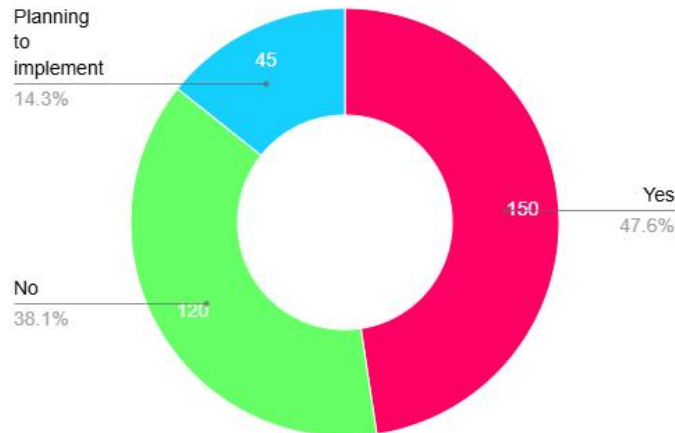


Figure No. 4 Implementation Status

The state of contemporary use of advanced control strategies demonstrates that the power sector is at the stage of profound change. On one hand, with 47.6 percent of entities actually deploying the solutions today, there is a sense that grid stability is being modernized. On the other hand, 38.1 percent of these entities are not yet adopting the solutions. Notably, 14.3

percent of them are on planning and this means that they are increasingly becoming recognized as necessary. This unequal adoption landscape highlights one crucial point of development: those that adopt early (usually larger utilities or projects supported by research) are moving forward, and others still need to overcome systemic obstacles.

Table 5: Barriers to Adoption (Multiple Responses Allowed)

Barrier	Frequency	Percentage
High implementation cost	210	66.7%
Lack of skilled personnel	180	57.1%
Regulatory constraints	135	42.9%
Integration with legacy systems	150	47.6%
Other	30	9.5%

The main barriers to the wider adoption are complex. Costs of implementation (66.7%) are the major areas of concern; this cost is propagated by the cost of sensors, control hardware, software integration, and system-wide upgrading. Additionally, there is a critical skills gap (57.1%), because the need to develop expertise in AI/ML, power electronics and cyber-physical systems exceeds the supply. Further problems with deployments are integration issues of legacy infrastructure

(47.6%) when legacy substations, incompatible communication protocols, and old control systems do not easily keep up with modernization. Also, governmental restrictions (42.9%) in pilot scaling and institutional adoption include the use of aging grid codes and certification regulations, which take a significant amount of time, along with a lack of standards to measure emerging technologies in a similar way.

Table 6: Most Impactful Technology (Next Decade)

Technology	Frequency	Percentage
AI/ML-based control	135	42.9%
Advanced energy storage	90	28.6%
Wide-area monitoring (PMUs)	60	19.0%
Blockchain for grid security	15	4.8%
Other	15	4.8%

Based on the occupational groups surveyed and comparing the percentage of each group identifying AI/ML-based control (42.9) as the most impactful technology in the next decade, this sort of control stands out overwhelmingly as the next-decade technology that needs to be in place. This supremacy symbolizes the great level of familiarity (71.4%) and effectiveness of the AI/ML solutions that were evident in the previous data. Enhanced energy storage (28.6%) closely follows, as it is legalized to deliver synthetics inertia, frequency control, and renewable firmness, which is opposite to

the highest mentioned consequences of intervalid generation and low-inertia networks. In communicating mechanisms outermost monitoring (PMUs/WAMS) (19.0%), although not as widely cited, is also in the background since it facilitates the intelligences AI-powered and coordinated controls. Compared conspicuously, blockchain grid security (4.8) lags almost in an empty race, indicating an insufficient level of industry certainty around heavy application scalability in the short term, to anchor its use stability in the near term market.

Table 7: Likelihood of Investment (Next 5 Years)

Likelihood	Frequency	Percentage
Very Likely	90	28.6%
Likely	120	38.1%
Neutral	75	23.8%
Unlikely	24	7.6%
Very Unlikely	6	1.9%

A good majority (66.7%) of the industry respondents report that investment in advanced control strategies is Likely (38.1%) or Very Likely (28.6%) within five years. Such strong optimism is indicative of a decisive transition of theoretical interest to practical adoption that is being encouraged by the increasing pressure to deal with renewable integration issues (81.0%) and cybersecurity threats (47.6%). Right in the middle is the neutral cohort (23.8%), the utility of which is waiting to be proved or prices to be lowered, with out-and-out skepticism being a fringe group (9.5% Unlikely/Very Unlikely).

Discussion

The results of study present invaluable information about the present challenges, strategic preparedness and perspective as far as adoption of advanced control strategies in improved power system stability is concerned. A representative and wide range of professionals were engaged in the activities, most of them being Power System Engineers, Researchers and the Control System Engineers. This demographic complex is a great marriage of applied and theoretical skills and so the findings apply widely in the academic, industrial, and operational contexts.

Among the major trends that stand out of the data is the overall recognition of renewable energy integration as a current problem of modern power systems. More respondents than not (80 per cent) found this to be a principal concern, as intermittent inverter-based forms of generation are increasingly taxing grid reliability. This follows up with the way frequency and voltage changes are mentioned, the second most mentioned issue, which supports the notion that variable sources of energy are interdependent with system imbalances. Cyber-security and aging nature of grid infrastructure are further

contributing to these technical instabilities and hence it is observed that the threat landscape that modern power systems are operating through is complex as well as rapidly changing.

Technically in the survey of all professionals, most reported a knowledge base of a diversity of advanced control techniques, especially controls based on AI/ML, adaptive controls, and wide-area monitors. It is a good indication of knowledge sharing and interest in innovation in the domain. Significant positive correlation between recognition and perception of effectiveness indicate that the stakeholders within the industry are not only aware of these strategies but also have faith in their ability to address the existing grid concerns.

Positively though, almost two-thirds of the respondents view advanced control strategies as being very or extremely effective. This indicates increased assurance in the dynamic and real-time nature of these technologies to respond to grid disturbances and increase resiliency of operation. However, part of the participants also had moderate or low levels of confidence indicating tense issues behind the scene pertaining to implementation viability, compatibility of the system, or diversity in real-life performances.

Its implementation status gives a realistic picture of the development of the industry. More than forty percent of the organizations surveyed have already implemented strenuous control strategies, and another percentage of the organizations surveyed are still planning to do so. Nevertheless, a significant portion is not involved, which is probably caused by the identified obstacles that include the possibility of high costs of implementation and lack of skilled workforce. The problem of compatibility with legacy infrastructure and limitation of the regulatory environment also

rose to the surface as major setbacks necessitating the expansion of supporting institutions, labor training, and more up-to-date policies regarding the grid.

The future levels of control systems development are heavily biased toward AI/ML-based applications as revealed by both popularity and anticipated influence by the next decade. It is not only considered the most transformational, but also the most investable technology as most of the respondents had high probabilities of making an investment in a short period of time. The increasing popularity of increased energy storage systems is another factor that promotes the shift toward systems capable of absorbing the variability of renewable energy. In the meantime, blockchain as a grid security example is showing a promise, but has received little confidence or usage in practical applications.

All in all, the paper points to a power systems community that is highly cognizant of the paradigm shift in operation necessitated by the renewable transition and digitalization. On the one hand, it is obvious that the technical innovation is only growing, yet on the other hand, it is easy to see that such economic, regulation and infrastructural enablers as the ones needed simply have to develop along with the technical innovation. The ability to overcome the two major issues of cost and skills deficit will be important elements to drive the implementation of advanced control strategies. As the energy industry seeks to handle a more complex environment, the merging of intelligent, adaptive and data-based control systems is not only seen as desirable but is imperative to achieve a long term grid stability and sustainability.

Conclusion and Recommendations

This research places strong emphasis on the importance of more developed control measures to resolve the expanding stability issues in contemporary power networks, especially as renewable energy resources rise. The switch to the usage of inverter-based resources has caused a vast decrease in system inertia resulting in frequency and voltage changes, and cyber-security risks and crumbling infrastructure make dealing with the grid even more complicated. The complexity of these issues has rendered the traditional control methods as inadequate and therefore the move towards adaptive and data driven methods is necessary.

In an attempt to improve power system stability, a number of recommendations can be raised. First, the use of AI/ML-based control systems that will be flexible in real-time and can make predictions is a priority that grid-operators and utilities should make. Such technologies are efficient to deal with the uncertainty of renewable generation and enhance the resilience of the system. Second, it is necessary to invest in wide-area monitoring systems (WAMS) and IoT sensing sensors to achieve situational awareness and to conduct integrated control of distributed – networks. Third, the use of grid-forming inverters must be massively adopted that restores the same stabilization characteristics of synchronous generators counteracting inertia-based issues.

It is also important to address the implementations barriers. Industry players and policy makers need to pool resources and find a way to cut down on the cost via subsidies, pilot schemes and uniform models. The development of workforce ought to be encouraged, through advanced control technology training of professionals, filling the skills gap. Also, the regulatory changes will be required to facilitate the integration between

new solutions and legacy infrastructure and make them cybersecurity-compliant.

Lastly, the study should also look into future research into hybrid methods that involve a physics-based model implemented in conjunction with machine learning to increase accuracy in the assessment of stability. The creation of digital twins to test the possibilities of the scenarios will also test control strategies depending on many conditions. In implementing such solutions, the power industry could attain an enhanced, stable, reliable, and sustainable grid, which is a system that withstands clean energy transition.

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