

CYBER ATTACK FOR OPTIMAL POWER FLOW CONTROL

Rubana Khan, Sakshi Khangar, Siya Khobragade, Aditi Gupta, Sneha Urkude, Vaishnavi Bhanose

Computer Technology , PCE, Nagpur, India

EMAIL : rubi.tarannum@gmail.com, khangars095@gmail.com, siyakhobragade@gmail.com, aditigupta1464@gmail.com, snehaurkude212@gmail.com, vaishnavibhanose21@gmail.com

Abstract:

This study explores the impact of cyber attacks on Optimal Power Flow (OPF) control in modern power grids. We examine various attack types, including data injection and denial-of-service, that can disrupt power distribution and compromise system stability. Through simulations, we demonstrate how minor data alterations can lead to significant operational failures. We also propose a framework using machine learning for detecting and mitigating these threats, emphasizing the need for robust cybersecurity in the energy sector. Our findings highlight the necessity for secure power grid architectures to enhance resilience against cyber threats.

Keywords — Machine Learning, Cyber Attack, Optimal Power Flow (OPF), Power Grid Security, Data Injection, Denial-of-Service (DoS), Machine Learning.

I. INTRODUCTION

As power grids evolve into complex interconnected systems, the integration of digital technologies enhances their efficiency but also exposes them to cyber vulnerabilities. Optimal Power Flow (OPF) control is critical for managing electricity generation and distribution, ensuring that demand is met while minimizing operational costs and losses. However, the reliance on real-time data and automated control systems makes OPF susceptible to cyber attacks. Cyber threats, including data injection, denial-of-service (DoS), and phishing, can disrupt OPF systems, leading to improper load balancing, equipment damage, and large-scale blackouts. These attacks manipulate control signals, resulting in significant financial and safety implications.

This study explores the nature of these cyber threats, their potential impacts on power grid operations, and strategies for mitigation. By enhancing our understanding of these risks, we can better protect critical infrastructure and ensure reliable power delivery in an increasingly digitized energy landscape.

II. OBJECTIVE

The primary objectives of this study on cyber attacks affecting Optimal Power Flow (OPF) control are:

1. To analyse the specific vulnerabilities within OPF control systems that can be exploited by cyber attacks.
2. To propose effective cybersecurity measures and best practices to protect OPF systems

from cyber threats and enhance overall grid resilience.

3. To assess vulnerabilities in OPF systems to enhance security.
4. To analyse the impact of cyber attacks on power grid stability and efficiency.
5. To develop effective mitigation strategies to safeguard against potential threats.

III. LITERATURE SURVEY

With the integration of new energy sources, particularly wind power generation, the intermittent and unstable nature of wind energy has notably affected power flow in system operations. This paper tackles these challenges by incorporating wind power uncertainty, wind speed correlation, and load uncertainty into its analysis. By modelling both wind power generation and load, the article reformulates the optimal power flow model as a semidefinite programming problem that allows for relaxation. This transformation aids in addressing the complex, non-linear optimization challenges typical of power system operations. The proposed method's validity has been confirmed through multiple standard IEEE test cases, showcasing its effectiveness in managing the uncertainties and correlations associated with large-scale wind power integration and offering a robust solution for future power system optimization and planning. [(1)]. This paper introduces a quasi-optimal power flow (OPF) algorithm specifically designed for flexible DC traction power systems (TPSs). The quasi-OPF approach offers near-optimal OPF solutions with high computational efficiency, diverging from traditional OPF algorithms that rely on complex mathematical optimization methods. The authors first present a novel modelling technique that elucidates the physical significance of OPF solutions in flexible DC TPSs. By translating this physical understanding into mathematical expressions, they establish a straightforward mapping from power flow solutions to near-optimal OPF solutions, thereby creating the quasi-OPF algorithm. Since the computation of power flow is relatively inexpensive and the mapping relies on

basic arithmetic, the quasi-OPF algorithm achieves remarkably fast execution times, operating in sub second intervals and delivering a speed increase of 57 times compared to the primaldual interior point method. The effectiveness of this approach is validated through mathematical proofs and a case study involving Beijing Metro

Line 13. This research enhances the understanding of the physical implications of OPF solutions and serves as a valuable tool for flexible DC TPSs in analyzing coordinated control effects, developing real-time control strategies, and addressing operational challenges in planning. [(2)].

This paper explores risk-constrained optimal power flow as an effective method for managing the fluctuations of renewable energy in power system scheduling and operation. It addresses limitations in existing research, which often relies on sample average approximation methods that can be computationally inefficient or struggle with variable generation regulation coefficients. To overcome these challenges, the authors employ the entropic value-at-risk as a computationally efficient risk measure for assessing operational risks in power systems. They propose an efficient algorithm to solve the risk-constrained DC optimal power flow, utilizing a Gaussian mixture model to represent the continuous density of wind power. The paper provides analytical expressions and convex conic formulations of constraints related to entropic value-at-risk. Numerical experiments conducted on a modified IEEE 39-bus system validate the effectiveness of the proposed method. [(3)].

This paper addresses the complex challenges of optimal power flow in electrical power systems using metaheuristic optimization techniques, specifically Particle Swarm Optimization (PSO). Given the non-linear and non-convex nature of the optimal power flow problem, the study aims to achieve better results than previous approaches. The proposed method focuses on minimizing fuel costs while ensuring that generator outputs, bus voltages, shunt capacitors, reactors, and transformer tap settings remain within safe limits. A comparative analysis between PSO and Genetic Algorithms reveals the numerical advantages of the PSO approach, demonstrating its effectiveness over other

optimization methods, including artificial bee colony algorithms. The findings suggest a potential for significant cost savings, exceeding €5 per kilowatt-hour (KWh), highlighting the methodology's innovative and economically beneficial implications for future applications in the power industry. [(4)].

This paper addresses the impact of renewable energy generation uncertainty on power flow in transmission grids by developing a stochastic optimal power flow model grounded in the steady-state security region (SSR). Initially, it derives hyperplane expressions for SSR using the AC power flow model and sensitivity analysis. Subsequently, a chance constrained optimal power flow model is formulated with the incorporation of the Cornish-Fisher series. To solve this model, the authors propose a heuristic algorithm. The approach is validated through simulations on a modified IEEE 39node transmission grid, demonstrating its effectiveness in efficiently managing uncertain power injections while maintaining secure operational constraints. [(5)].

This paper investigates the security constrained optimal power flow (SCOPF) aimed at minimizing generation costs while ensuring that system parameters remain within allowable limits. Key parameters include voltage levels, line power flow, and the active and reactive power outputs from power plants. A non-linear quadratic cost objective function is developed, focusing on the active power generated by the units. The study employs the MATPOWER interior point solver to analyse the IEEE-9 bus test network, aiming to minimize costs while adhering to security constraints on bus voltages and line flows. The findings demonstrate that the proposed quadratic cost function effectively facilitates operation at minimal costs while maintaining system security limits, using MATLAB's MATPOWER tool for analysis [(6)].

This paper explores a method to enhance operational efficiency and mitigate issues arising from the uncertainty of photovoltaic (PV) output and load demands by employing second-order cone programming (SOCP) and two-stage robust

optimization (TSRO) for optimal power flow (OPF) analysis. The OPF model is initially developed using SOCP, which is then integrated into a TSRO framework. In the first stage, the objective is to minimize the costs associated with energy storage charging and discharging while addressing worst-case scenarios for load forecasts and PV output, represented through a novel uncertainty set. The second stage focuses on optimizing the output of thermal power units for the operational day. The TSRO model is solved using a column and constraint generation (C&CG) algorithm. Validation through simulations on the enhanced IEEE-33 bus system confirms the practicality of applying TSRO to optimal power flow management [(7)].

This study focuses on improving voltage security in power systems by ensuring sufficient dynamic reactive power reserves (DRPR) following credible contingencies. As the generation mix evolves, coordinating the operation of distributed energy resources (DERs) within active distribution systems (ADS) can enhance the security of the integrated transmission system (TS) and ADS. The paper proposes a preventive voltage security constrained optimal power flow (SCOPF) model designed for this integrated system, aimed at securing adequate DRPR during normal operations to prevent voltage violations after contingencies. A two-stage approach is utilized, addressing both normal and post-contingency states. The model is solved in a distributed manner using the truncated diagonal quadratic approximation (TDQA) algorithm, which facilitates communication of active and reactive power flows through the boundary feeder. The efficacy of this approach is demonstrated through a study of the T30D33 test system, with comparisons made to other cases to evaluate its effectiveness in maintaining voltage security. [(8)].

This paper addresses the limitations of existing Second-Order Cone Programming (SOCP) models for optimal power flow (OPF) in meshed power networks, where cyclic angle constraints are often not satisfied. The authors propose a new SOCP-OPF model specifically designed for power transmission networks that ensures compliance with

these cyclic angle constraints, regardless of the network's meshed configuration. The innovative aspect of this model is its use of a convex envelope to accurately represent relative bus voltage angles that meet the cyclic constraint criteria. Extensive testing on various IEEE networks, including the 14-bus, 57-bus, 118-bus, 500bus, and 2736-bus systems, demonstrates that the proposed model is both computationally efficient and scalable for large transmission networks, outperforming traditional Nonlinear Programming (NLP) and semi-definite programming (SDP) methods [(9)].

This paper addresses the critical role of Flexible AC Transmission System (FACTS) devices in enhancing power flow control and increasing transfer capability in future power grids, particularly with the growing integration of renewable energy sources. The authors focus on the computationally challenging task of optimizing the placement of these devices within transmission systems. They propose a rapid and efficient method for determining optimal FACTS locations, utilizing sensitivities derived from DC optimal power flow (DCOPF) shadow prices obtained from operational data. This approach not only identifies the most effective deployment sites for FACTS devices but also supports more complex analyses for optimal allocation. The proposed method's effectiveness is validated through simulation studies on modified RTS96 and IEEE 300-bus test systems, demonstrating its potential for improving power system performance. [(10)].

This article explores the challenges posed by increasing uncertainties in power systems due to the widespread use of renewable electricity generation, focusing on the AC optimal power flow problem with renewable generators treated as chance constraints. To make this problem more numerically manageable, the authors propose approximating the chance constraints with analytical forms. While previous methods have demonstrated feasibility, they often lack strict error limits. To address this, the paper introduces a smooth approximate function that ensures solutions from the approximate optimization problem remain feasible and converge to the original chance-

constrained problem. Through case studies and comparative analyses, the proposed method's feasibility and reduced conservatism are validated, highlighting its effectiveness in enhancing the safe operation of power systems amidst uncertainties. [(11)].

IV. PROPOSED METHODOLOGY

Data Collection and Preprocessing

Source: Utilize the Cyber Security Dataset for training and validating predictive models.

Processing: Clean the dataset by handling missing values, normalizing features, and extracting relevant characteristics.

Add functionality to train statistical, machine learning, and deep learning models. Use libraries like scikitlearn and TensorFlow or PyTorch for this purpose.

Real-Time Monitoring Framework Integrate IoT device data collection for real-time monitoring and create visual dashboards using a library like Plotly or Django Charts.

Model Validation

Implement a validation method to evaluate model performance and display results.

DATA FLOW DIAGRAM

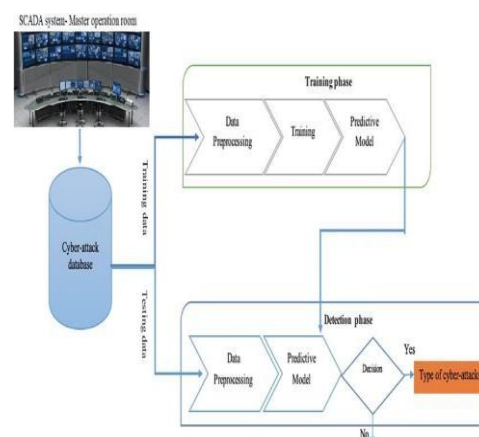


Fig .1 Data Flow-Diagram of Cyber Attack for Optimal Power Flow Control

ACKNOWLEDGMENT

The authors would like to thank Priyadarshini College of Engineering, Nagpur, for their continuous support and encouragement in conducting this research. Special thanks to our mentors and faculty members for their valuable guidance and insightful discussions that contributed to the successful completion of this work.

Conference on Power and Electrical Engineering, 2024.

REFERENCES

- [1] C. Yihua et al., "Optimal Power Flow based on Semidefinite Programming Relaxation," 2024.
- [2] Z. Li et al., "Fast Quasi-Optimal Power Flow of Flexible DC Traction Power Systems," IEEE Transactions on Power Systems, 2024.
- [3] H. Zeng et al., "An Efficient Algorithm for Solving Entropy Value-at-Risk Constrained DC Optimal Power Flow," IEEE Power & Energy Society General Meeting, 2024.
- [4] S. Halwani et al., "Comparative Analysis of Genetic Algorithm and Particle Swarm Optimization," IEEE Advances in Science and Engineering Technology, 2024.
- [5] B. Hu et al., "Stochastic Optimal Power Flow in Transmission Grid," IEEE International Conference on Electronic Engineering, 2024.
- [6] B. Singh et al., "Security Constrained Optimal Power Flow Solution of Utility Grid Power Network," IEEE International Conference on Intelligent Technologies, 2024.
- [7] X. Liu et al., "Two-stage Robust Optimal Power Flow for Distribution Network," IEEE International Conference on Intelligent Robotics, 2024.
- [8] A. Sahoo et al., "Preventive Voltage Security Constrained Optimal Power Flow Model," IEEE Power & Energy Society General Meeting, 2024.
- [9] M. M. Chowdhury et al., "SOCP Based Optimal Power Flow Model With Cyclic Constraints," IEEE Transactions on Power Systems, 2024.
- [10] X. Rui et al., "Sensitivity-Based Method for Optimal Placement of FACTS Devices," IEEE North American Power Symposium, 2024.
- [11] H. Xu et al., "Solving Chance Constrained Optimal AC Power Flow Problems," IEEE Asia