Operational Planning for Emerging Distribution Systems: A Unique Perspective on Grid Expansion

# Other titles in Foundations and Trends<sup>®</sup> in Electric Energy Systems

Distributed Optimization for the DER-Rich Electric Power Grid Jannatul Adan and Anurag K. Srivastava ISBN: 978-1-63828-292-1

Peer-to-Peer Energy Sharing: A Comprehensive Review Wayes Tushar, Sohrab Nizami, M. Imran Azim, Chau Yuen, David B. Smith, Tapan Saha and H. Vincent Poor ISBN: 978-1-63828-156-6

Distribution System Optimization to Manage Distributed Energy Resources (DERs) for Grid Services Anamika Dubey and Sumit Paudyal ISBN: 978-1-63828-188-7

LLC Resonant Converters: An Overview of Modeling, Control and Design Methods and Challenges Claudio Adragna ISBN: 978-1-63828-066-8

The Role of Power Electronics in Modern Energy System Integration Saeed Peyghami, Subham Sahoo, Huai Wang, Xiongfei Wang and Frede Blaabjerg ISBN: 978-1-63828-008-8

# Operational Planning for Emerging Distribution Systems: A Unique Perspective on Grid Expansion

# Anna Stuhlmacher

Michigan Technological University annastu@mtu.edu

Chee-Wooi Ten Michigan Technological University ten@mtu.edu

Lawrence Dilworth Michigan Technological University Idilwort@mtu.edu

Yachen Tang Envision Digital, Inc. yachen.tang@envision-digital.com



# Foundations and Trends<sup>®</sup> in Electric Energy Systems

Published, sold and distributed by: now Publishers Inc. PO Box 1024 Hanover, MA 02339 United States Tel. +1-781-985-4510 www.nowpublishers.com sales@nowpublishers.com

Outside North America: now Publishers Inc. PO Box 179 2600 AD Delft The Netherlands Tel. +31-6-51115274

The preferred citation for this publication is

A. Stuhlmacher *et al.*. Operational Planning for Emerging Distribution Systems: A Unique Perspective on Grid Expansion. Foundations and Trends<sup>®</sup> in Electric Energy Systems, vol. 7, no. 2, pp. 63–164, 2023.

ISBN: 978-1-63828-301-0 © 2024 A. Stuhlmacher *et al.* 

All rights reserved. No part of this publication may be reproduced, stored in a retrieval system, or transmitted in any form or by any means, mechanical, photocopying, recording or otherwise, without prior written permission of the publishers.

Photocopying. In the USA: This journal is registered at the Copyright Clearance Center, Inc., 222 Rosewood Drive, Danvers, MA 01923. Authorization to photocopy items for internal or personal use, or the internal or personal use of specific clients, is granted by now Publishers Inc for users registered with the Copyright Clearance Center (CCC). The 'services' for users can be found on the internet at: www.copyright.com

For those organizations that have been granted a photocopy license, a separate system of payment has been arranged. Authorization does not extend to other kinds of copying, such as that for general distribution, for advertising or promotional purposes, for creating new collective works, or for resale. In the rest of the world: Permission to photocopy must be obtained from the copyright owner. Please apply to now Publishers Inc., PO Box 1024, Hanover, MA 02339, USA; Tel. +1 781 871 0245; www.nowpublishers.com; sales@nowpublishers.com

now Publishers Inc. has an exclusive license to publish this material worldwide. Permission to use this content must be obtained from the copyright license holder. Please apply to now Publishers, PO Box 179, 2600 AD Delft, The Netherlands, www.nowpublishers.com; e-mail: sales@nowpublishers.com

# Foundations and Trends<sup>®</sup> in Electric Energy Systems

Volume 7, Issue 2, 2023 Editorial Board

#### **Editor-in-Chief**

Marija D. Ilić MIT and Carnegie Mellon University United States

#### Editors

David Hill University of Hong Kong and University of Sydney

Rupamathi JaddivadalSmartGridz

Daniel Kirschen University of Washington

J. Zico Kolter Carnegie Mellon University

Chao Lu Tsinghua University

Steven Low California Institute of Technology

Masoud H. Nazaril Wayne State University

Ram Rajagopa Stanford University

Lou van der Sluis  $TU \ Delft$ 

Goran Strbac Imperial College London

Robert J. Thomas Cornell University

David Tse University of California, Berkeley

Le Xie Texas A&M University

# **Editorial Scope**

# Topics

Foundations and Trends<sup>®</sup> in Electric Energy Systems publishes survey and tutorial articles in the following topics:

- Advances in power dispatch
- Demand-side and grid scale data analytics
- Design and optimization of electric services
- Distributed control and optimization of distribution networks
- Distributed sensing for the grid
- Distribution systems
- Fault location and service restoration
- Integration of physics-based and data-driven modeling of future electric energy systems
- Integration of Power electronics, Networked FACTS
- Integration of renewable energy sources
- Interdependence of power system operations and planning and the electricity markets
- Microgrids

- Modern grid architecture
- Power system analysis and computing
- Power system dynamics
- Power system operation
- Power system planning
- Power system reliability
- Power system transients
- Security and privacy
- Stability and control for the whole multi-layer (granulated) network with new load models (to include storage, DR, EVs) and new generation
- System protection and control
- The new stability guidelines and control structures for supporting high penetration of renewables (>50%)
- Uncertainty quantification for the grid
- System impacts of HVDC

## Information for Librarians

Foundations and Trends<sup>®</sup> in Electric Energy Systems, 2023, Volume 7, 4 issues. ISSN paper version 2332-6557. ISSN online version 2332-6565. Also available as a combined paper and online subscription.

# Contents

| 1 | Introduction |   | 3  |
|---|--------------|---|----|
|   | 1.1          | Evolution of Distribution System Planning               | 5  |
|   | 1.2          | Energy Consumption of Customers and Billing Workflow    | 8  |
|   | 1.3          | New Additions and Challenges Ahead                      | 12 |
|   | 1.4          | Organization of This Monograph                          | 13 |
| 2 | Eme          | rging Technologies in Distribution Systems              | 15 |
|   | 2.1          | Improved Planning with Geographic Information Systems . | 15 |
|   | 2.2          | Interaction of GIS with SCADA Topological Updates       | 17 |
|   | 2.3          | Topological Structure of Distribution Network           | 18 |
|   | 2.4          | Reconfigurability of the Primary Distribution Networks  | 28 |
| 3 | Dist         | ributed Energy Resources in Distribution Systems        | 33 |
|   | 3.1          | Promoting DER Participation and Demand Response         |    |
|   |              | Programs  | 34 |
|   | 3.2          | DER Management Systems and Distributed Control          | 35 |
|   | 3.3          | Coupling the Transportation Sector into Planning        | 38 |
|   | 3.4          | Distribution System's Interaction with other Critical   |    |
|   |              | Infrastructure Sectors                                  | 39 |

| 4          | Renewable Energy Sources in Distribution Systems       |  |    |  |  |
|------------|--|--|----|--|--|
|            | 4.1  | Advantages of Incorporating Renewable Energy Sources | 43 |  |  |
|            | 4.2  | Non-Wire Alternatives Utilizing RESs                 | 47 |  |  |
|            | 4.3  | Development of Networked Microgrids                  | 49 |  |  |
| 5          | Battery Energy Storage Systems in Distribution Systems |  |    |  |  |
|            | 5.1  | The Role of Battery Storage in a Decarbonized Grid   | 53 |  |  |
|            | 5.2  | Challenges for BESSs                                 | 55 |  |  |
|            | 5.3  | BESSs in Distribution Systems                        | 56 |  |  |
| 6          | Flex   | tible Loads in Distribution Systems                  | 59 |  |  |
|            | 6.1  | Buildings  | 61 |  |  |
|            | 6.2  | Electric Vehicles                                    | 62 |  |  |
|            | 6.3  | Multi-Sector Coordination                            | 66 |  |  |
| 7          | Extension of Approximate Models with Net-Negative and  |  |    |  |  |
|            | Net  | -Zero Loads  | 72 |  |  |
|            | 7.1  | Radial Feeders with Uniformly Distributed Loads      | 73 |  |  |
|            | 7.2  | Radial Feeders with Non-Uniformly Distributed Loads  | 73 |  |  |
|            | 7.3  | Radial Feeders with Generation Involved              | 75 |  |  |
|            | 7.4  | Frequency Fluctuations                               | 76 |  |  |
| 8          | Con  | cluding Remarks                                      | 79 |  |  |
| Ac         | Acronyms   |  |    |  |  |
| Ac         | Acknowledgements                                       |  |    |  |  |
| References |  |  | 85 |  |  |

# **Operational Planning for Emerging Distribution Systems: A Unique Perspective on Grid Expansion**

Anna Stuhlmacher<sup>1</sup>, Chee-Wooi Ten<sup>2</sup>, Lawrence Dilworth<sup>3</sup> and Yachen Tang<sup>4</sup>

<sup>1</sup>Michigan Technological University, USA; annastu@mtu.edu

<sup>2</sup>Michigan Technological University, USA; ten@mtu.edu

<sup>3</sup>Michigan Technological University, USA; ldilwort@mtu.edu

<sup>4</sup>Envision Digital, Inc., USA; yachen.tang@envision-digital.com

#### ABSTRACT

The electrical grid has undergone significant transformations, which have had a profound impact on its distribution system development and expansion. These changes have been primarily driven by changing load profiles, distributed generation sources, and increasingly extreme weather events. Advancements in sensor and communication technologies have played a pivotal role in addressing and adapting to these changes. These changes have also led to an increased focus on reliability and resilience in planning, with priority placed on ensuring robust grid connectivity and flexibility.

Three decades ago, power distribution systems were primarily radial with unidirectional power flow. Today's electrical distribution systems have distributed energy resources, leading to bidirectional power flow. The utility's geographic information system network, advanced metering infrastructure, and other technologies are leveraged to allow feeders

Anna Stuhlmacher, Chee-Wooi Ten, Lawrence Dilworth and Yachen Tang (2023), "Operational Planning for Emerging Distribution Systems: A Unique Perspective on Grid Expansion", Foundations and Trends<sup>®</sup> in Electric Energy Systems: Vol. 7, No. 2, pp 63–164. DOI: 10.1561/3100000033.

and distributed energy resources to be interconnected. This has facilitated the integration of the electric grid with networked microgrids, which has improved the overall resilience and efficiency of the distribution system.

While there have been notable improvements in grid planning, the power grid remains vulnerable to high-impact, low-frequency events caused by climate change, such as hurricanes and tornadoes. This monograph outlines potential solutions for addressing future electric grid issues, including transformer overloading due to electric vehicles, optimization challenges, advanced feeder reconfiguration, and contingency planning for extreme events. The proposed approaches focus on the implementation and operation of new technologies, such as renewable energy sources, batteries, flexible loads, and advanced sensors, that have the potential to transform distribution network planning and operation. From traditional methods to innovative networked microgrids within existing infrastructure and non-wire alternative strategies, this monograph provides a comprehensive overview of stateof-the-art strategies for future problems.

# 1

# Introduction

The electrical distribution grid has a long history dating back to the late 19th century, consisting of overhead lines, transformers, and other equipment that deliver electricity to individual consumers. Over time, the grid has undergone significant changes driven by technological advancements, evolving energy demands, and environmental considerations. The original distribution system operated in a unidirectional and radial fashion, where distribution lines linked distribution substations to individual customers. This is illustrated as a one-line diagram in Figure 1.1, where the arrows indicate the direction of power flow and the red squares denote metered points. This system was connected to a simple network of high-voltage transmission lines carrying electricity over long distances. Today's energy system is more decentralized, featuring numerous smaller, distributed energy resources generating power closer to the point of consumption. Regulatory changes helped facilitate this transition, with market competition gradually introduced since the 1970s. While this has led to more complex distribution systems capable of accommodating a wider range of energy sources and dynamic loads, there are new challenges associated with these planning and operational changes.

Introduction



Figure 1.1: One-line diagram of a conventional feeder configuration from a past era.

Advances in technology have played a crucial role in the evolution of the distribution grid, enabling utilities to better monitor and control the flow of electricity. The rise of digital technologies such as smart meters and advanced sensors have enabled greater efficiency, reliability, and flexibility as well as improved customer service. Energy storage has also emerged as a major trend in recent years, with advances in battery technology making it possible to store large amounts of energy at increasingly lower costs, making energy storage an increasingly viable solution for grid operators. However, the integration of new technologies and energy sources into existing grid infrastructure has posed a challenge, requiring significant investments in grid modernization and the development of new standards and regulations to ensure the safety and reliability of the grid. Climate change has also presented challenges, with extreme weather events causing widespread power outages and damage to the grid.

#### 1.1. Evolution of Distribution System Planning

Several key trends are expected to shape the future of the distribution grid, including the growth of distributed energy resources, the importance of data and analytics in grid management, and the development of energy storage technology. Utilities have been investing in smart grid technologies—such as advanced metering infrastructure, distributed control systems, and grid infrastructure upgrades to support bi-directional power flow—to keep up with these trends. Additionally, the development and improvement of protective relaying systems are becoming increasingly important to ensure grid stability and reliability. Investing in advanced protective relaying systems and incorporating them into operational planning is crucial to minimize downtime and equipment damage as well as enhance customer satisfaction.

#### 1.1 Evolution of Distribution System Planning

Over the years, there have been changes in distribution utility planning. Initially, the focus was on meeting growing demand by building more transmission lines and expanding the service area. The distribution system was generally over-designed and largely ignored. Traditional planning methods, such as load forecasting, analyzed data collected from the grid, but their effectiveness was constrained by the limited availability of real-time data. However, with the increase in complexity of the grid and the evolution of customer needs, the planning process became more sophisticated.

In the 1980s and 1990s, the focus shifted to improving the efficiency and reliability of the grid. Distribution utilities invested in new technologies such as computerized monitoring systems and advanced metering infrastructure, which made it possible to collect and analyze data from the grid in real time. Feeder remote terminal units (FRTUs) were employed to automate the distribution system's computerized management system, depicted in Figure 1.2 as solid red squares. FR-TUs are often pole-mounted boxes with sophisticated logic devices and small battery packs that constantly send measurements to distribution dispatching center. This centralized framework allows operators in the control room to perform informed decision making based on conclusions from the computer applications. Demand-side management became a

Introduction



Figure 1.2: One-line diagram showcasing AMI placement and unidirectional flow of power from the feeder head to all connected customers.

focus, and customers were encouraged to reduce energy consumption during periods of high demand. This helped to reduce the need for new infrastructure investments and improve the overall efficiency of the grid.

The 2000s marked a critical era for the utility industry, characterized by a wave of new challenges driven by the increasing prevalence of renewable energy sources (RESs), notably solar photovoltaic panels and wind turbines. This shift in the energy landscape compelled utilities to adopt innovative tools and techniques for modeling and analyzing the profound impact of RESs on the grid. The key transformation lay in the need to effectively manage the two-way flow of power, which departed from the traditional one-way energy distribution model. To address this, utilities invested significantly in emerging technologies, with distribution automation standing out as a prime example. This technology enabled remote monitoring and control of power flow on the grid, ushering in a new level of grid management efficiency.

#### 1.1. Evolution of Distribution System Planning

Consequently, the planning process underwent a remarkable evolution, characterized by a transition to a more data-driven and complex approach. Utilities found themselves adapting to changing customer needs and the rapid pace of technological advances. They had to integrate the fluctuating and often unpredictable energy generation from RESs into their grid infrastructure while ensuring grid stability and reliability. This required a holistic reevaluation of grid design, operational procedures, and investment strategies, ultimately reshaping the utility landscape into one that embraced sustainability, advanced technology, and a greater degree of adaptability in the face of ongoing energy transformations.

Another trend in distribution system planning is the increasing use of underground cables in various parts of the world, especially in densely populated areas and locations with challenging terrain or extreme weather conditions. While generally more expensive due to the installation process involving digging trenches, laying cables, and backfilling them, underground cables may be more cost-effective in certain situations, such as in densely populated areas where they reduce the risk of outages and have lower maintenance costs and a longer lifespan than overhead lines. Undergrounding cables is also a strategy of utilities to reduce the risk of wildfire ignition by power lines in high wildfire risk areas. In general, the use of underground cables can impact the planning of the grid by requiring additional considerations around cost, infrastructure, and overall grid capacity and flexibility.

In conclusion, the planning process for distribution utilities has recently undergone a significant evolution. The focus has shifted from meeting growing demand to improving the efficiency and reliability of the grid, and then to adapting to the challenges posed by distributed energy resources. Today, utilities are using a wide range of tools and techniques to optimize grid performance, reduce costs, and improve the customer experience. The planning process has become much more complex and data driven, reflecting the changing needs of customers and the pace of technological change.

Introduction

#### 1.2 Energy Consumption of Customers and Billing Workflow

During the 1970s, Automatic Meter Reading (AMR) technology relied on electromechanical meters. Electromechanical meters were incapable of real-time monitoring and detailed consumption data, resulting in unreliable and insufficient data for effective demand forecasting or load management purposes. It was not until the 1980s and subsequent years that AMR witnessed improved reliability and wider adoption, thanks to the emergence of more advanced technologies like solid-state meters and advanced communication protocols. Although AMR technology has been available since the 1970s, its widespread popularity did not occur until the 1990s. Advanced Metering Infrastructure (AMI) is a more recent, sophisticated innovation that commenced its initial deployments in the early 2000s. However, it was not until the mid-to-late 2000s that AMI started to gain significant acceptance within the utility sector, and it continues to undergo ongoing development and expansion even now.

While both AMI and AMR involve the collection of data from utility meters, they possess distinct capabilities. AMR is a technology that facilitates remote data collection from utility meters using wireless or power line carrier communication. AMR systems primarily gather fundamental information, such as the total energy consumption of a customer within a billing period. In contrast, AMI systems facilitate bi-directional communication between the utility and the meter. This enhanced system enables real-time monitoring and remote control of the meter. AMI systems gather data more frequently, usually every 15 minutes, offering utilities detailed insights into customer usage patterns. This data enables estimation of electricity consumption, assessment of the overall distribution system's health, and facilitates load management optimization, fault detection, and energy efficiency enhancements through data analytics.

Figure 1.2 depicts the placement of AMIs in the distribution feeder with hollow green diamonds which are replacing AMRs. Household consumption is sent via IP-based infrastructure, where homes can be grouped into home area networks (HANs) and neighborhood area networks (NANs). The metering data is generally transmitted to the utility's consumer billing center via wifi, wireless communication (e.g., LTE or

#### 1.2. Energy Consumption of Customers and Billing Workflow

5G), or power line carriers. These metering systems incorporate advanced analytics tools to assist utilities in comprehending the enormous volumes of data collected. This data can be utilized for purposes such as demand response, outage management, and load forecasting. However, as demonstrated in [30], there is a potential risk of malware affecting distribution grid operations, which can make meter data unavailable or inaccurate. The study in [31] aims to utilize metered datasets from primary and secondary distribution networks to correlate metering inconsistencies, potentially identifying any foul play. Additionally, the granular details of metering profiles from existing meters implemented in [54] could significantly aid in grid expansion planning.

Figure 1.3 displays a large customer load profile observed over a year, with the data obtained from a meter every 10 minutes. The deployment of new smart meters can have several implications on utility planning. Here are a few ways in which smart meters can impact the planning process:

1. Demand forecasting: Utilities have access to more granular data on energy consumption, which can be used to better forecast demand. This information can help utilities make more informed decisions about how to allocate resources, such as building new power plants or investing in energy storage systems. The provided load profile underscores the significance of demand forecasting within emerging distribution systems, especially with the adoption of AMI. Demand forecasting involves predicting future electricity consumption patterns, crucial for ensuring a reliable power supply and efficient resource allocation. AMI systems offer utilities access to highly detailed energy consumption data, collected at short intervals, which greatly enhances the precision of forecasting. Through the understanding of usage patterns, load profiling, and predictions of future demand, utilities can make more informed decisions on infrastructure planning, the deployment of energy storage solutions, and overall resource management. This data-driven approach minimizes waste and optimizes electricity generation and distribution to meet actual demand effectively.





Figure 1.3: An example load profile captured by an AMI meter. The blue line represents the instantaneous power consumption collected every 10 minutes. The solid green, red, and black lines represent different power consumption averages over the time horizon.

2. Load balancing: Load balancing is a vital component in efficiently managing an electricity grid and ensuring the consistent delivery of power to consumers. Smart meters, particularly those within AMI systems, play a pivotal role in enhancing load balancing. They achieve this by collecting intricate data on electricity consumption, not only quantifying the energy used but also precisely when it is used. This granular data empowers utilities to gain profound insights into consumer behavior and usage patterns. With this information, utilities can pinpoint peak demand periods, often occurring during specific times of the day, and effectively manage heightened electricity consumption. By monitoring realtime demand and making necessary adjustments, smart meters help prevent grid overloads, which can lead to power outages or blackouts. Furthermore, they facilitate load-shifting strategies, encouraging consumers to use electricity during off-peak hours to optimize resource utilization and reduce the risk of grid overloads during peak periods. Consequently, this approach significantly mitigates blackout risks, ensuring grid stability and the reliable availability of power, even during high-demand periods. The im-

#### 1.2. Energy Consumption of Customers and Billing Workflow

plementation of incentive-based control policies by utilities has effectively mitigated operational risks, ensuring a more efficient load balancing and reducing stress on the transmission system, especially during hot summer periods.

- 3. Asset management: Asset management within utility infrastructure is of paramount importance, and smart meters assume a pivotal role in this domain. By continuously collecting and transmitting real-time data on the performance of critical equipment like transformers and switches, smart meters offer a dynamic perspective that transcends conventional scheduled inspections. Their true value lies in the early detection of potential issues, allowing utilities to proactively address anomalies, irregularities, and signs of wear and tear before they escalate into major problems. This preventive approach not only averts costly equipment failures but also guarantees a more dependable power supply for consumers, resulting in significant cost savings and reduced downtime. By optimizing operational efficiency through data-informed decisions, smart meters contribute to more efficient and reliable power distribution systems.
- 4. Customer engagement: Within today's utility sector, active customer engagement stands as a critical priority, with smart meters assuming a central role in driving this engagement. Smart meters furnish customers with comprehensive, real-time insights into their energy consumption behaviors, transcending the traditional monthly billing approach. This empowerment enables consumers to gain a deeper understanding of their electricity usage, facilitating informed decisions to curtail consumption and opt for rate plans tailored to their habits. The outcomes extend beyond mere cost savings; they encompass heightened customer satisfaction through the bestowal of transparency and personal control over energy consumption. Ultimately, smart meters actively contribute to diminished energy consumption, thus nurturing a more sustainable and eco-friendly energy landscape, while concurrently fortifying the relationship between utility providers and their customers.

#### Introduction

The deployment of new smart meters offers utilities a plethora of data that can be utilized to enhance planning and operation. By leveraging this data, utilities can more effectively manage their assets, balance energy supply and demand, and offer improved services to their customers. The implementation of smart meters can significantly influence utility planning as they are electronic devices capable of measuring and recording electricity usage in real time, enabling more precise billing and enhanced visibility into energy consumption patterns.

#### 1.3 New Additions and Challenges Ahead

The modernization of the distribution grid has resulted in substantial changes in the planning, design, and operation of utilities. In the past, grid planning focused on ensuring there was enough power to meet demand and maintaining system reliability and safety. Today, the planning process is much more complex, taking into account several factors, such as changes in energy demand, advancements in technology, integration of renewable energy sources, and the need to lower greenhouse gas emissions.

One of the essential changes in grid planning is the move toward a more flexible and decentralized grid architecture. This shift is driven by the growing use of distributed energy resources (DERs), such as rooftop solar panels, energy storage systems, and electric vehicles. The integration of these resources necessitates a more adaptable grid structure that can accommodate two-way power flow and provide real-time energy flow control. To facilitate this shift, utilities invest in advanced technologies like AMI and distribution management systems (DMS) that provide real-time grid condition data. The use of data analytics and modeling tools has also been increasingly incorporated in grid planning to make informed decisions. These tools enable utilities to analyze a massive amount of data from diverse sources to identify patterns and trends that can guide planning and operations. Predictive analytics, for instance, can be used to predict energy demand and optimize resource allocation for cost-effectiveness and efficiency.

Moreover, utilities are concentrating on reducing greenhouse gas emissions and tackling the impacts of climate change by deploying

#### 1.4. Organization of This Monograph

strategies such as adding renewable energy sources, improving energy efficiency, minimizing the carbon intensity of electricity generation, demand response participation, and hardening the grid to natural hazards. To achieve these objectives, utilities are developing long-term plans, taking into account a range of scenarios, and involving stakeholders like customers, regulators, and environmental groups. There is also an increasing focus of considering the power grid's interactions and interdependence with other critical infrastructure systems to improve overall reliability and resiliency.

Overall, the modernization of the distribution grid is steering significant changes in grid planning, design, and operation, aimed at creating a more flexible, resilient, and sustainable grid that can address the evolving needs of customers and society. To achieve this, utilities are investing in new technologies, systems, and strategies while collaborating closely with stakeholders to align their actions with their communities' requirements. This will ensure that the grid can overcome emerging reliability and resilience challenges and prepare future grids.

#### 1.4 Organization of This Monograph

This monograph presents an interconnected discussion of new developments in distribution systems, encompassing networked microgrids, prosumers, net metering, and non-wire alternatives (NWAs). To make the content more accessible to a wider audience, this section offers a high-level overview of the content flow between the sections. A flowchart in Figure 1.4 illustrates the connections between the various sections, articulating the relationship of loads and distributed generation.

The introduction serves as the starting point of the monograph, providing a broad overview of its contents, which are subsequently explored in greater detail in Section 2. Sections 1 and 2 offer essential information that lays the foundation for the subtopics that follow. Section 3 focuses on the management and control of Distributed Energy Resources (DERs). The next three sections examine different types of DERs more specifically: Section 4 covers Renewable Energy Sources (RESs), Section 5 covers Battery Energy Storage Systems (BESSs) and Section 6 covers flexible loads (FLs). Section 7 represents the extension

Introduction



Figure 1.4: Interdependencies between sections and organization of the monograph.

of approximate models with lumped loads along the future feeders, considering the gradual lumping of loads leading to net-negative load effects.

Finally, in Section 8, the paper concludes by summarizing the entirety of the subject matter covered, particularly focusing on the topics of security and the complexity of cyber asset management within an organization.

- F. Adinolfi, G. M. Burt, P. Crolla, F. D'Agostino, M. Saviozzi, and F. Silvestro, "Distributed energy resources management in a low-voltage test facility," *IEEE Transactions on Industrial Electronics*, vol. 62, no. 4, 2015, pp. 2593–2603. DOI: 10.1109/ TIE.2014.2377133.
- [2] H. Aki, T. Wakui, and R. Yokoyama, "Optimal management of fuel cells in a residential area by integrated-distributed energy management system (IDEMS)," in 2016 IEEE Power & Energy Society Innovative Smart Grid Technologies Conference (ISGT), pp. 1–5, 2016. DOI: 10.1109/ISGT.2016.7781156.
- [3] H. Alharbi and K. Bhattacharya, "Stochastic optimal planning of battery energy storage systems for isolated microgrids," *IEEE Transactions on Sustainable Energy*, vol. 9, no. 1, 2018, pp. 211– 227. DOI: 10.1109/TSTE.2017.2724514.
- [4] P. Alstone, J. Potter, M. A. Piette, P. Schwartz, M. A. Berger, L. N. Dunn, S. J. Smith, M. D. Sohn, A. Aghajanzadeh, S. Stensson, *et al.*, "2025 California demand response potential study-charting California's demand response future. final report on phase 2 results," Lawrence Berkeley National Lab, Tech. Rep. 2001113, 2017.

- [5] D. A. Aponte-Roa, C.-W. Ten, and W. W. Weaver, "Estimation of affected customers and load loss under wind storms in the caribbean region," *IEEE Systems Journal*, vol. 16, no. 2, 2022, pp. 3226–3236. DOI: 10.1109/JSYST.2021.3113814.
- [6] J. Barton and D. Infield, "Energy storage and its use with intermittent renewable energy," *IEEE Transactions on Energy Conversion*, vol. 19, no. 2, 2004, pp. 441–448. DOI: 10.1109/TEC. 2003.822305.
- [7] E. M. Bibra, E. Connelly, S. Dhir, M. Drtil, P. Henriot, I. Hwang, J.-B. Le Marois, S. McBain, L. Paoli, and J. Teter, "Global ev outlook 2022: Securing supplies for an electric future," *International Energy Agency*, 2022.
- [8] A. G. Boulanger, A. C. Chu, S. Maxx, and D. L. Waltz, "Vehicle electrification: Status and issues," *Proceedings of the IEEE*, vol. 99, no. 6, 2011, pp. 1116–1138. DOI: 10.1109/JPROC.2011. 2112750.
- [9] V. Calderaro, V. Galdi, F. Lamberti, and A. Piccolo, "A smart strategy for voltage control ancillary service in distribution networks," *IEEE Transactions on Power Systems*, vol. 30, no. 1, 2015, pp. 494–502. DOI: 10.1109/TPWRS.2014.2326957.
- [10] F. Calero, C. A. Cañizares, K. Bhattacharya, C. Anierobi, I. Calero, M. F. Z. de Souza, M. Farrokhabadi, N. S. Guzman, W. Mendieta, D. Peralta, B. V. Solanki, N. Padmanabhan, and W. Violante, "A review of modeling and applications of energy storage systems in power grids," *Proceedings of the IEEE*, 2022, pp. 1–26. DOI: 10.1109/JPROC.2022.3158607.
- [11] M. C. Campi, S. Garatti, and M. Prandini, "The scenario approach for systems and control design," *Annual Reviews in Control*, vol. 33, no. 2, 2009, pp. 149–157.
- W. Cassel, "Distribution management systems: Functions and payback," *IEEE Transactions on Power Systems*, vol. 8, no. 3, 1993, pp. 796–801. DOI: 10.1109/59.260926.

#### References

- [13] G. Chaspierre, G. Denis, P. Panciatici, and T. Van Cutsem, "A dynamic equivalent of active distribution network: Derivation, update, validation and use cases," *IEEE Open Access Journal* of Power and Energy, vol. 8, 2021, pp. 497–509. DOI: 10.1109/ OAJPE.2021.3102499.
- [14] K. Clement-Nyns, E. Haesen, and J. Driesen, "The impact of charging plug-in hybrid electric vehicles on a residential distribution grid," *IEEE Transactions on Power Systems*, vol. 25, no. 1, 2009, pp. 371–380. DOI: 10.1109/TPWRS.2009.2036481.
- [15] L. Coles, S. Chapel, and J. Iamucci, "Valuation of modular generation, storage, and targeted demand-side management," *IEEE Transactions on Energy Conversion*, vol. 10, no. 1, 1995, pp. 182–187. DOI: 10.1109/60.372585.
- [16] J. E. Contreras-Ocaña, U. Siddiqi, and B. Zhang, "Non-wire alternatives to capacity expansion," in 2018 IEEE Power & Energy Society General Meeting (PESGM), pp. 1–5, 2018. DOI: 10.1109/PESGM.2018.8586182.
- [17] E. Dall'Anese, P. Mancarella, and A. Monti, "Unlocking flexibility: Integrated optimization and control of multienergy systems," *IEEE Power and Energy Magazine*, vol. 15, no. 1, 2017, pp. 43– 52. DOI: 10.1109/MPE.2016.2625218.
- [18] J. Deboever, J. Peppanen, A. Maitra, G. Damato, J. Taylor, and J. Patel, "Energy storage as a non-wires alternative for deferring distribution capacity investments," in 2018 IEEE/PES Transmission and Distribution Conference and Exposition (T&D), pp. 1–5, 2018. DOI: 10.1109/TDC.2018.8440406.
- [19] Y. Ding, C. Decker, I. Vassileva, F. Wallin, and M. Beigl, "A smart energy system: Distributed resource management, control and optimization," in 2011 2nd IEEE PES International Conference and Exhibition on Innovative Smart Grid Technologies, pp. 1–8, 2011. DOI: 10.1109/ISGTEurope.2011.6162720.
- [20] D. L. Donaldson and D. Jayaweera, "Weather informed need attributes for non-wires alternatives in distribution networks," in 2020 IEEE Power & Energy Society General Meeting (PESGM), pp. 1–5, 2020. DOI: 10.1109/PESGM41954.2020.9281917.

- [21] A. Dubey, A. Bose, M. Liu, and L. N. Ochoa, "Paving the way for advanced distribution management systems applications: Making the most of models and data," *IEEE Power and Energy Magazine*, vol. 18, no. 1, 2020, pp. 63–75. DOI: 10.1109/MPE.2019.2949442.
- [22] *Electric vehicles.* URL: https://www.iea.org/energy-system/ transport/electric-vehicles.
- [23] Federal Energy Regulatory Commission, Participation of distributed energy resource aggregations in markets operated by regional transmission organizations and independent system operators, 2020. URL: https://www.ferc.gov/sites/default/files/2020-09/E-1\_0.pdf.
- [24] D. Fooladivanda, A. D. Domínguez-García, and P. W. Sauer, "Utilization of water supply networks for harvesting renewable energy," *IEEE Transactions on Control of Network Systems*, vol. 6, no. 2, 2018, pp. 763–774. DOI: 10.1109/TCNS.2018. 2873946.
- [25] C. García-Santacruz, A. Marano-Marcolini, and J. L. Martinez-Ramos, "A review of non-wires alternatives to distribution network reinforcements: Comparison of utility and investor perspectives," in 2023 IEEE International Conference on Environment and Electrical Engineering and 2023 IEEE Industrial and Commercial Power Systems Europe (EEEIC / I&CPS Europe), pp. 1– 6, 2023. DOI: 10.1109/EEEIC/ICPSEurope57605.2023.10194742.
- [26] M. Giuntoli and D. Poli, "Optimized thermal and electrical scheduling of a large scale virtual power plant in the presence of energy storages," *IEEE Transactions on Smart Grid*, vol. 4, no. 2, 2013, pp. 942–955. DOI: 10.1109/TSG.2012.2227513.
- [27] P. K. Goel, B. Singh, S. S. Murthy, and N. Kishore, "Isolated wind-hydro hybrid system using cage generators and battery storage," *IEEE Transactions on Industrial Electronics*, vol. 58, no. 4, 2011, pp. 1141–1153. DOI: 10.1109/TIE.2009.2037646.
- [28] P. Goncalves Da Silva, D. Ilić, and S. Karnouskos, "The impact of smart grid prosumer grouping on forecasting accuracy and its benefits for local electricity market trading," *IEEE Transactions* on Smart Grid, vol. 5, no. 1, 2014, pp. 402–410. DOI: 10.1109/ TSG.2013.2278868.

- [29] T. Gönen, Electric Power Distribution Engineering. CRC Press, 2014.
- [30] Y. Guo, C.-W. Ten, S. Hu, and W. W. Weaver, "Preventive maintenance for advanced metering infrastructure against malware propagation," *IEEE Transactions on Smart Grid*, vol. 7, no. 3, 2016, pp. 1314–1328. DOI: 10.1109/TSG.2015.2453342.
- [31] Y. Guo, C.-W. Ten, and P. Jirutitijaroen, "Online data validation for distribution operations against cybertampering," *IEEE Transactions on Power Systems*, vol. 29, no. 2, 2014, pp. 550–560. DOI: 10.1109/TPWRS.2013.2282931.
- [32] C. P. Guzmán, J. C. López, G. Sanchez, L. Z. Terada, M. J. Rider, and L. C. P. da Silva, "An ADMM-based distributed energy management system for microgrids," in 2022 IEEE PES Innovative Smart Grid Technologies Conference Europe (ISGT-Europe), pp. 1–5, 2022. DOI: 10.1109/ISGT-Europe54678.2022. 9960612.
- [33] H. Hao, B. M. Sanandaji, K. Poolla, and T. L. Vincent, "Aggregate flexibility of thermostatically controlled loads," *IEEE Transactions on Power Systems*, vol. 30, no. 1, 2015, pp. 189–198. DOI: 10.1109/TPWRS.2014.2328865.
- [34] M. Horoufiany, A. Kazemi, and V. Maleki, "The management of distributed energy resources for voltage control in smart grids," in 20th Iranian Conference on Electrical Engineering (ICEE2012), pp. 462–466, 2012. DOI: 10.1109/IranianCEE.2012.6292402.
- [35] W. Hua, Y. Zhou, M. Qadrdan, J. Wu, and N. Jenkins, "Blockchain enabled decentralized local electricity markets with flexibility from heating sources," *IEEE Transactions on Smart Grid*, vol. 14, no. 2, 2023, pp. 1607–1620. DOI: 10.1109/TSG.2022. 3158732.
- [36] M. M. Hussain, W. Javed, R. Akram, T. Javed, A. Razaq, and M. Siddique, "Distributed energy management analysis for microgrids," in 2021 56th International Universities Power Engineering Conference (UPEC), pp. 1–6, 2021. DOI: 10.1109/ UPEC50034.2021.9548206.

References

- [37] IEA final energy consumption of buildings relative to other sectors, 2022. URL: https://www.iea.org/data-and-statistics/ charts/final-energy-consumption-of-buildings-relative-to-othersectors-2022.
- [38] *IEA grid-scale storage*. URL: https://www.iea.org/energysystem/electricity/grid-scale-storage.
- [39] "IEEE guide for distributed energy resources management systems (DERMS) functional specification," *IEEE Std 2030.11-2021*, 2021, pp. 1–61. DOI: 10.1109/IEEESTD.2021.9447316.
- [40] Y. Iino and Y. Hayashi, "Distributed coordinated energy management system for DERs to realize cooperative resilience against blackout of power grid," in 2022 61st Annual Conference of the Society of Instrument and Control Engineers (SICE), pp. 75–80, 2022. DOI: 10.23919/SICE56594.2022.9905835.
- [41] R. A. Iringan Iii, A. M. S. Janer, and L. A. R. Tria, "A machinelearning based energy management system for microgrids with distributed energy resources and storage," in 2022 25th International Conference on Electrical Machines and Systems (ICEMS), pp. 1–6, 2022. DOI: 10.1109/ICEMS56177.2022.9983198.
- [42] R. Johnson, "An era of many options: Future energy planning must take into account unprecedented numbers of options," *IEEE Power and Energy Magazine*, vol. 13, no. 4, 2015, pp. 18–28. DOI: 10.1109/MPE.2015.2418077.
- [43] S. Jothibasu, J. Peppanen, R. Ravikumar, and A. Maitra, "Value of energy storage as non-wires alternative for PV integration and stacked services," in 2020 47th IEEE Photovoltaic Specialists Conference (PVSC), pp. 0739–0743, 2020. DOI: 10.1109/ PVSC45281.2020.9300514.
- [44] K.-H. Jung, H. Kim, and D. Rho, "Determination of the installation site and optimal capacity of the battery energy storage system for load leveling," *IEEE Transactions on Energy Conver*sion, vol. 11, no. 1, 1996, pp. 162–167. DOI: 10.1109/60.486591.
- [45] A. Kargarian and G. Hug, "Optimal sizing of energy storage systems: A combination of hourly and intra-hour time perspectives," *IET Generation, Transmission & Distribution*, vol. 10, no. 3, 2016, pp. 594–600. DOI: 10.1016/j.ijepes.2019.01.019.

- [46] W. H. Kersting, Distribution System Modeling and Analysis. CRC Press, 2017.
- [47] A. Khodaei, S. Bahramirad, and M. Shahidehpour, "Microgrid planning under uncertainty," *IEEE Transactions on Power Systems*, vol. 30, no. 5, 2015, pp. 2417–2425. DOI: 10.1109/TPWRS. 2014.2361094.
- [48] H. Kirkham, D. Nightingale, and T. Koerner, "Energy management system design with dispersed storage and generation," *IEEE Transactions on Power Apparatus and Systems*, vol. PAS-100, no. 7, 1981, pp. 3432–3441. DOI: 10.1109/TPAS.1981.316686.
- [49] B. Kroposki, R. Lasseter, T. Ise, S. Morozumi, S. Papathanassiou, and N. Hatziargyriou, "Making microgrids work," *IEEE Power* and Energy Magazine, vol. 6, no. 3, 2008, pp. 40–53. DOI: 10. 1109/MPE.2008.918718.
- [50] G. S. Ledva, L. Balzano, and J. L. Mathieu, "Real-time energy disaggregation of a distribution feeder's demand using online learning," *IEEE Transactions on Power Systems*, vol. 33, no. 5, 2018, pp. 4730–4740. DOI: 10.1109/TPWRS.2018.2800535.
- [51] J. Li, H. You, J. Qi, M. Kong, S. Zhang, and H. Zhang, "Stratified optimization strategy used for restoration with photovoltaicbattery energy storage systems as black-start resources," *IEEE Access*, vol. 7, 2019, pp. 127339–127352. DOI: 10.1109/ACCESS. 2019.2937833.
- [52] Q. Li, S. Yu, A. S. Al-Sumaiti, and K. Turitsyn, "Micro water– energy nexus: Optimal demand-side management and quasiconvex hull relaxation," *IEEE Transactions on Control of Network Systems*, vol. 6, no. 4, 2018, pp. 1313–1322. DOI: 10.1109/ TCNS.2018.2889001.
- [53] T. Dy-Liacco, "Modern control centers and computer networking," *IEEE Computer Applications in Power*, vol. 7, no. 4, 1994, pp. 17–22. DOI: 10.1109/67.318916.
- [54] C. Liao, C.-W. Ten, and S. Hu, "Strategic FRTU deployment considering cybersecurity in secondary distribution network," *IEEE Transactions on Smart Grid*, vol. 4, no. 3, 2013, pp. 1264– 1274. DOI: 10.1109/TSG.2013.2256939.

- [55] Y.-T. Liao and C.-N. Lu, "Dispatch of EV charging station energy resources for sustainable mobility," *IEEE Transactions* on Transportation Electrification, vol. 1, no. 1, 2015, pp. 86–93. DOI: 10.1109/TTE.2015.2430287.
- [56] W. Liu, S. Niu, and H. Xu, "Optimal planning of battery energy storage considering reliability benefit and operation strategy in active distribution system," *Journal of Modern Power Systems* and Clean Energy, vol. 5, no. 2, 2017, pp. 177–186. DOI: 10.1007/ s40565-016-0197-4.
- [57] X. Liu, M. Shahidehpour, Z. Li, X. Liu, Y. Cao, and Z. Bie, "Microgrids for enhancing the power grid resilience in extreme conditions," *IEEE Transactions on Smart Grid*, vol. 8, no. 2, 2017, pp. 589–597. DOI: 10.1109/TSG.2016.2579999.
- [58] Y. Liu and M. S. Mauter, "Assessing the demand response capacity of US drinking water treatment plants," *Applied Energy*, vol. 267, 2020, p. 114 899. DOI: 10.1016/j.apenergy.2020.114899.
- [59] J. MacDonald, P. Cappers, D. Callaway, and S. Kiliccote, "Demand response providing ancillary services: A comparison of opportunities and challenges in US wholesale markets," Lawrence Berkeley National Laboratory, Tech. Rep. LBNL-5958E, 2023.
- [60] D. Maihöfner, I. Talavera, J. Hanson, C. Bott, and F. Oechsle, "Vertical reactive power flexibility through distributed energy resources for a reactive energy management," in 2017 11th IEEE International Conference on Compatibility, Power Electronics and Power Engineering (CPE-POWERENG), pp. 100–105, 2017. DOI: 10.1109/CPE.2017.7915152.
- [61] J. Mathieu, M. Dyson, D. Callaway, and A. Rosenfeld, "Using residential electric loads for fast demand response: The potential resource and revenues, the costs, and policy recommendations," in ACEEE Summer Study on Energy Efficiency in Buildings, Citeseer, pp. 189–203, 2012.
- [62] G. S. Misyris, D. I. Doukas, T. A. Papadopoulos, D. P. Labridis, and V. G. Agelidis, "State-of-charge estimation for li-ion batteries: A more accurate hybrid approach," *IEEE Transactions* on Energy Conversion, vol. 34, no. 1, 2019, pp. 109–119. DOI: 10.1109/TEC.2018.2861994.

- [63] R. Moghe and D. Tholomier, "Grid edge technology as a nonwires alternative," in 2020 IEEE Power & Energy Society General Meeting (PESGM), pp. 1–5, 2020. DOI: 10.1109/PESGM41954. 2020.9281971.
- [64] S. M. Mohseni-Bonab, I. Kamwa, A. Moeini, and A. Rabiee, "Voltage security constrained stochastic programming model for day-ahead BESS schedule in co-optimization of T&D systems," *IEEE Transactions on Sustainable Energy*, vol. 11, no. 1, 2020, pp. 391–404. DOI: 10.1109/TSTE.2019.2892024.
- [65] D. K. Molzahn and I. A. Hiskens, "A survey of relaxations and approximations of the power flow equations," *Foundations and Trends in Electric Energy Systems*, 2019.
- [66] D. Montenegro, C. McEntee, M. Hernandez, and R. Dugan, "Modern planning framework based on non-wires alternatives for advancing distribution planning," in 2023 IEEE Rural Electric Power Conference (REPC), pp. 44–50, 2023. DOI: 10.1109/ REPC49397.2023.00016.
- [67] "Monthly energy review, June 2023," U.S. Energy Information Agency, Tech. Rep. DOE/EIA-0035(2023/6), 2023.
- [68] A. Nagarajan and R. Ayyanar, "Design and strategy for the deployment of energy storage systems in a distribution feeder with penetration of renewable resources," *IEEE Transactions* on Sustainable Energy, vol. 6, no. 3, 2015, pp. 1085–1092. DOI: 10.1109/TSTE.2014.2330294.
- [69] Q. Nguyen, J. Ogle, X. Fan, X. Ke, M. R. Vallem, N. Samaan, and N. Lu, "EMS and DMS integration of the coordinative real-time sub-transmission volt-var control tool under high DER penetration," in 2021 IEEE Power & Energy Society General Meeting (PESGM), pp. 01–05, 2021. DOI: 10.1109/PESGM46819. 2021.9638160.
- [70] T. A. Nguyen and M. L. Crow, "Stochastic optimization of renewable-based microgrid operation incorporating battery operating cost," *IEEE Transactions on Power Systems*, vol. 31, no. 3, 2016, pp. 2289–2296. DOI: 10.1109/TPWRS.2015.2455491.

- S. Nowak, N. Tehrani, M. S. Metcalfe, W. Eberle, and L. Wang, "Cloud-based DERMS test platform using real-time power system simulation," in 2018 IEEE Power & Energy Society General Meeting (PESGM), pp. 1–5, 2018. DOI: 10.1109/PESGM.2018. 8585806.
- [72] N. O'Connell, P. Pinson, H. Madsen, and M. O'Malley, "Benefits and challenges of electrical demand response: A critical review," *Renewable and Sustainable Energy Reviews*, vol. 39, 2014, pp. 686–699. DOI: 10.1016/j.rser.2014.07.098.
- [73] D. Olsen, A. Aghajanzadeh, and A. McKane, "Opportunities for automated demand response in California agricultural irrigation," Lawrence Berkeley National Laboratory, Tech. Rep. LBNL-1003786, 2015.
- [74] M. A. Ortega-Vazquez, F. Bouffard, and V. Silva, "Electric vehicle aggregator/system operator coordination for charging scheduling and services procurement," *IEEE Transactions on Power Systems*, vol. 28, no. 2, 2013, pp. 1806–1815. DOI: 10.1109/ TPWRS.2012.2221750.
- [75] H. Padullaparti, M. Baggu, J. Wang, I. Mendoza, S. Tiwari, J. Wang, and S. Veda, "Conservation voltage reduction with distributed energy resource management system, grid-edge, and legacy devices: Preprint," Jul. 2023.
- [76] F. Pallonetto, M. De Rosa, F. Milano, and D. P. Finn, "Demand response algorithms for smart-grid ready residential buildings using machine learning models," *Applied Energy*, vol. 239, 2019, pp. 1265–1282. DOI: 10.1016/j.apenergy.2019.02.020.
- [77] H. Park, S. Bae, M. Chang, S.-h. Park, and G.-g. Yoon, "A community-scale energy management system for demand response participation of households with DERs and EVs," in 2019 IEEE 4th International Future Energy Electronics Conference (IFEEC), pp. 1–5, 2019. DOI: 10.1109/IFEEC47410.2019. 9015047.
- [78] J. Peppanen, J. Deboever, S. Coley, and A. Renjit, "Value of DERMS for flexible interconnection of solar photovoltaics," in *CIRED 2020 Berlin Workshop (CIRED 2020)*, vol. 2020, pp. 557– 560, 2020. DOI: 10.1049/oap-cired.2021.0116.

- [79] J. Peppanen, J. Taylor, M. Bello, and A. Maitra, "Integrating energy storage as a non-wires alternative for distribution capacity," in *CIRED 2020 Berlin Workshop (CIRED 2020)*, vol. 2020, pp. 247–250, 2020. DOI: 10.1049/oap-cired.2021.0320.
- [80] J. R. Pillai and B. Bak-Jensen, "Integration of vehicle-to-grid in the western danish power system," *IEEE Transactions on Sustainable Energy*, vol. 2, no. 1, 2011, pp. 12–19. DOI: 10.1109/ TSTE.2010.2072938.
- [81] S. Poudel, S. J. Keene, R. L. Kini, S. Hanif, R. B. Bass, and J. T. Kolln, "Modeling environment for testing a distributed energy resource management system (DERMS) using GridAPPS-D platform," *IEEE Access*, vol. 10, 2022, pp. 77383–77395. DOI: 10.1109/ACCESS.2022.3192845.
- [82] G. C. Pratt, M. L. Vadali, D. L. Kvale, and K. M. Ellickson, "Traffic, air pollution, minority and socio-economic status: Addressing inequities in exposure and risk," *International Journal* of Environmental Research and Public Health, vol. 12, no. 5, 2015, pp. 5355–5372. DOI: 10.3390/ijerph120505355.
- [83] A. J. D. Rathnayaka, V. M. Potdar, T. S. Dillon, O. K. Hussain, and E. Chang, "A methodology to find influential prosumers in prosumer community groups," *IEEE Transactions on Industrial Informatics*, vol. 10, no. 1, 2014, pp. 706–713. DOI: 10.1109/TII. 2013.2257803.
- [84] N. Rau and Y.-H. Wan, "Optimum location of resources in distributed planning," *IEEE Transactions on Power Systems*, vol. 9, no. 4, 1994, pp. 2014–2020. DOI: 10.1109/59.331463.
- [85] B. Reid, J. Bourg, and D. Schmidt, "Let's make a deal: Non-wires alternatives for traditional transmission and distribution?" *IEEE Power and Energy Magazine*, vol. 20, no. 2, 2022, pp. 23–31. DOI: 10.1109/MPE.2021.3134145.
- [86] P. Rezaei, J. Frolik, and P. D. Hines, "Packetized plug-in electric vehicle charge management," *IEEE Transactions on Smart Grid*, vol. 5, no. 2, 2014, pp. 642–650. DOI: 10.1109/TSG.2013.2291384.

- [87] L. A. Roald, K. Sundar, A. Zlotnik, S. Misra, and G. Andersson, "An uncertainty management framework for integrated gas-electric energy systems," *Proceedings of the IEEE*, vol. 108, no. 9, 2020, pp. 1518–1540. DOI: 10.1109/JPROC.2020.3005505.
- [88] J. Romero Aguero and A. Khodaei, "Grid modernization, der integration & utility business models - trends & challenges," *IEEE Power and Energy Magazine*, vol. 16, no. 2, 2018, pp. 112– 121. DOI: 10.1109/MPE.2018.2811817.
- [89] D. Rosewater, S. Ferreira, D. Schoenwald, J. Hawkins, and S. Santoso, "Battery energy storage state-of-charge forecasting: Models, optimization, and accuracy," *IEEE Transactions on Smart Grid*, vol. 10, no. 3, 2019, pp. 2453–2462. DOI: 10.1109/TSG.2018.2798165.
- [90] D. M. Rosewater, D. A. Copp, T. A. Nguyen, R. H. Byrne, and S. Santoso, "Battery energy storage models for optimal control," *IEEE Access*, vol. 7, 2019, pp. 178357–178391. DOI: 10.1109/ACCESS.2019.2957698.
- [91] S. Ross and J. Mathieu, "Strategies for network-safe load control with a third-party aggregator and a distribution operator," *IEEE Transactions on Power Systems*, vol. 36, no. 4, 2021, pp. 3329– 3339. DOI: 10.1109/TPWRS.2021.3052958.
- [92] N. Rotering and M. Ilic, "Optimal charge control of plug-in hybrid electric vehicles in deregulated electricity markets," *IEEE Transactions on Power Systems*, vol. 26, no. 3, 2011, pp. 1021– 1029. DOI: 10.1109/TPWRS.2010.2086083.
- [93] S. Salman and I. Rida, "Investigating the impact of embedded generation on relay settings of utilities electrical feeders," *IEEE Transactions on Power Delivery*, vol. 16, no. 2, 2001, pp. 246–251. DOI: 10.1109/61.915490.
- [94] M. R. Sarker, Y. Dvorkin, and M. A. Ortega-Vazquez, "Optimal participation of an electric vehicle aggregator in day-ahead energy and reserve markets," *IEEE Transactions on Power Systems*, vol. 31, no. 5, 2015, pp. 3506–3515. DOI: 10.1109/PESGM.2016. 7741311.

- [95] A. Schwele, A. Arrigo, C. Vervaeren, J. Kazempour, and F. Vallée, "Coordination of electricity, heat, and natural gas systems accounting for network flexibility," *Electric Power Systems Research*, vol. 189, 2020, p. 106776. DOI: 10.1016/j.epsr.2020. 106776.
- [96] N. Scott, D. Atkinson, and J. Morrell, "Use of load control to regulate voltage on distribution networks with embedded generation," *IEEE Transactions on Power Systems*, vol. 17, no. 2, 2002, pp. 510–515. DOI: 10.1109/TPWRS.2002.1007926.
- [97] S. Shao, M. Pipattanasomporn, and S. Rahman, "Grid integration of electric vehicles and demand response with customer choice," *IEEE Transactions on Smart Grid*, vol. 3, no. 1, 2012, pp. 543–550. DOI: 10.1109/TSG.2011.2164949.
- [98] I. Sharma, C. Cañizares, and K. Bhattacharya, "Smart charging of PEVs penetrating into residential distribution systems," *IEEE Transactions on Smart Grid*, vol. 5, no. 3, 2014, pp. 1196–1209. DOI: 10.1109/TSG.2014.2303173.
- [99] M. Singh, P. Kumar, and I. Kar, "Implementation of vehicle to grid infrastructure using fuzzy logic controller," *IEEE Transactions on Smart Grid*, vol. 3, no. 1, 2012, pp. 565–577. DOI: 10.1109/TSG.2011.2172697.
- [100] P. Staats, W. Grady, A. Arapostathis, and R. Thallam, "A statistical analysis of the effect of electric vehicle battery charging on distribution system harmonic voltages," *IEEE Transactions* on Power Delivery, vol. 13, no. 2, 1998, pp. 640–646. DOI: 10. 1109/61.660951.
- [101] L. Strezoski, "Distributed energy resource management systems—DERMS: State of the art and how to move forward," WIREs Energy and Environment, vol. 12, no. 1, 2023, e460. DOI: 10.1002/wene.460.
- [102] L. Strezoski, H. Padullaparti, F. Ding, and M. Baggu, "Integration of utility distributed energy resource management system and aggregators for evolving distribution system operators," *Journal of Modern Power Systems and Clean Energy*, vol. 10, no. 2, 2022, pp. 277–285. DOI: 10.35833/MPCE.2021.000667.

- [103] L. Strezoski, M. Prica, and K. A. Loparo, "Generalized  $\Delta$ -circuit concept for integration of distributed generators in online short-circuit calculations," *IEEE Transactions on Power Systems*, vol. 32, no. 4, 2017, pp. 3237–3245. DOI: 10.1109/TPWRS. 2016.2617158.
- [104] L. Strezoski, M. Prica, and K. A. Loparo, "Sequence domain calculation of active unbalanced distribution systems affected by complex short circuits," *IEEE Transactions on Power Systems*, vol. 33, no. 2, 2018, pp. 1891–1902. DOI: 10.1109/TPWRS.2017. 2742019.
- [105] L. Strezoski and I. Stefani, "Utility DERMS for active management of emerging distribution grids with high penetration of renewable DERs," *Electronics*, vol. 10, no. 16, 2021. DOI: 10.3390/electronics10162027.
- [106] L. V. Strezoski, B. Dumnic, B. Popadic, M. Prica, and K. A. Loparo, "Novel fault models for electronically coupled distributed energy resources and their laboratory validation," *IEEE Transactions on Power Systems*, vol. 35, no. 2, 2020, pp. 1209–1217. DOI: 10.1109/TPWRS.2019.2943123.
- [107] L. V. Strezoski, N. R. Vojnovic, V. C. Strezoski, P. M. Vidovic, M. D. Prica, and K. A. Loparo, "Modeling challenges and potential solutions for integration of emerging DERs in DMS applications: Power flow and short-circuit analysis," *Journal of Modern Power Systems and Clean Energy*, vol. 7, no. 6, Nov. 2019, pp. 1365–1384. DOI: 10.1007/s40565-018-0494-1.
- [108] A. Stuhlmacher and J. L. Mathieu, "Chance-constrained water pumping to manage water and power demand uncertainty in distribution networks," *Proceedings of the IEEE*, vol. 108, no. 9, 2020, pp. 1640–1655. DOI: 10.1109/JPROC.2020.2997520.
- [109] A. Stuhlmacher and J. L. Mathieu, "Flexible drinking water pumping to provide multiple grid services," *Electric Power Sys*tems Research, vol. 212, 2022, p. 108 491. DOI: 10.1016/j.epsr. 2022.108491.

#### References

- [110] W. Su, J. Wang, K. Zhang, and M.-Y. Chow, "Framework for investigating the impact of PHEV charging on power distribution system and transportation network," in *IECON 2012 -38th Annual Conference on IEEE Industrial Electronics Society*, pp. 4735–4740, 2012. DOI: 10.1109/IECON.2012.6389482.
- [111] W. Su, J. Wang, K. Zhang, and A. Q. Huang, "Model predictive control-based power dispatch for distribution system considering plug-in electric vehicle uncertainty," *Electric Power Systems Research*, vol. 106, 2014, pp. 29–35. DOI: https://doi.org/10. 1016/j.epsr.2013.08.001.
- [112] X. Tan, Y. Wu, and D. H. K. Tsang, "Pareto optimal operation of distributed battery energy storage systems for energy arbitrage under dynamic pricing," *IEEE Transactions on Parallel and Distributed Systems*, vol. 27, no. 7, 2016, pp. 2103–2115. DOI: 10.1109/TPDS.2015.2478785.
- [113] Y. Tang, S. Zhao, C.-W. Ten, K. Zhang, and T. Logenthiran, "Establishment of enhanced load modeling by correlating with occupancy information," *IEEE Transactions on Smart Grid*, vol. 11, no. 2, 2020, pp. 1702–1713. DOI: 10.1109/TSG.2019. 2942581.
- [114] C. Tarazona, M. Muscholl, R. Lopez, and J. C. Passelergue, "Integration of distributed energy resources in the operation of energy management systems," in 2009 IEEE PES/IAS Conference on Sustainable Alternative Energy (SAE), pp. 1–5, 2009. DOI: 10.1109/SAE.2009.5534858.
- [115] C.-W. Ten and Y. Tang, *Electric Power: Distribution Emergency* Operation, 1st ed. CRC, 2018.
- [116] C.-W. Ten, E. Wuergler, H.-J. Diehl, and H. B. Gooi, "Extraction of geospatial topology and graphics for distribution automation framework," *IEEE Transactions on Power Systems*, vol. 23, no. 4, 2008, pp. 1776–1782. DOI: 10.1109/TPWRS.2008.2004835.
- [117] R. Uluski, "Using standards to integrate distributed energy resources with distribution management systems," in 22nd International Conference and Exhibition on Electricity Distribution (CIRED 2013), pp. 1–3, 2013. DOI: 10.1049/cp.2013.1219.

- [118] M. Vanin, H. Ergun, R. D'hulst, and D. Van Hertem, "Comparison of linear and conic power flow formulations for unbalanced low voltage network optimization," *Electric Power Systems Research*, vol. 189, 2020, p. 106 699. DOI: 10.1016/j.epsr.2020.106699.
- [119] E. Veldman and R. A. Verzijlbergh, "Distribution grid impacts of smart electric vehicle charging from different perspectives," *IEEE Transactions on Smart Grid*, vol. 6, no. 1, 2015, pp. 333– 342. DOI: 10.1109/TSG.2014.2355494.
- [120] I. Vijay, A. Aghajanzadeh, and O. Schetrit, "Low-cost, scalable, fast demand response for municipal wastewater and recycling facilities," California Energy Commission, Tech. Rep. CEC-500-2015-086, 2015.
- [121] V. V. Viswanathan and M. Kintner-Meyer, "Second use of transportation batteries: Maximizing the value of batteries for transportation and grid services," *IEEE Transactions on Vehicular Technology*, vol. 60, no. 7, 2011, pp. 2963–2970. DOI: 10.1109/TVT.2011.2160378.
- G. Von Wald, K. Sundar, E. Sherwin, A. Zlotnik, and A. Brandt,
  "Optimal gas-electric energy system decarbonization planning," *Advances in Applied Energy*, vol. 6, 2022, p. 100086. DOI: 10. 1016/j.adapen.2022.100086.
- [123] E. Vrettos, E. C. Kara, J. MacDonald, G. Andersson, and D. S. Callaway, "Experimental demonstration of frequency regulation by commercial buildings—part i: Modeling and hierarchical control design," *IEEE Transactions on Smart Grid*, vol. 9, no. 4, 2018, pp. 3213–3223. DOI: 10.1109/TSG.2016.2628897.
- [124] E. Vrettos, E. C. Kara, J. MacDonald, G. Andersson, and D. S. Callaway, "Experimental demonstration of frequency regulation by commercial buildings—part ii: Results and performance evaluation," *IEEE Transactions on Smart Grid*, vol. 9, no. 4, 2018, pp. 3224–3234.
- [125] E. I. Vrettos and S. A. Papathanassiou, "Operating policy and optimal sizing of a high penetration RES-BESS system for small isolated grids," *IEEE Transactions on Energy Conversion*, vol. 26, no. 3, 2011, pp. 744–756. DOI: 10.1109/TEC.2011.2129571.

- [126] C. Wang and M. Nehrir, "Analytical approaches for optimal placement of distributed generation sources in power systems," *IEEE Transactions on Power Systems*, vol. 19, no. 4, 2004, pp. 2068–2076. DOI: 10.1109/TPWRS.2004.836189.
- [127] Z. Wang, B. Chen, J. Wang, M. M. Begovic, and C. Chen, "Coordinated energy management of networked microgrids in distribution systems," *IEEE Transactions on Smart Grid*, vol. 6, no. 1, 2015, pp. 45–53. DOI: 10.1109/TSG.2014.2329846.
- [128] O. Wong, K. Chandra, V. Joshi, J. Heider, S. Maity, G. Maples, S. Jothibasu, and S. Santoso, "Simplified benchtop model of a distributed energy resource management system," in 2018 IEEE Power & Energy Society General Meeting (PESGM), pp. 1–5, 2018. DOI: 10.1109/PESGM.2018.8586503.
- [129] J. Xiong, K. Zhang, Y. Guo, and W. Su, "Investigate the impacts of PEV charging facilities on integrated electric distribution system and electrified transportation system," *IEEE Transactions* on Transportation Electrification, vol. 1, no. 2, 2015, pp. 178–187. DOI: 10.1109/TTE.2015.2443798.
- Q. Xu, L. Xie, and T. Dragicevic, "Distributed finite-time power management for hybrid energy storage systems in dc microgrids," in 2020 IEEE 11th International Symposium on Power Electronics for Distributed Generation Systems (PEDG), pp. 170–174, 2020. DOI: 10.1109/PEDG48541.2020.9244305.
- [131] D. L. Yao, S. S. Choi, K. J. Tseng, and T. T. Lie, "Determination of short-term power dispatch schedule for a wind farm incorporated with dual-battery energy storage scheme," *IEEE Transactions on Sustainable Energy*, vol. 3, no. 1, 2012, pp. 74–84. DOI: 10.1109/TSTE.2011.2163092.
- [132] M. A. Zehir and M. Bagriyanik, "Smart energy aggregation network (sean): An advanced management system for using distributed energy resources in virtual power plant applications," in 2015 3rd International Istanbul Smart Grid Congress and Fair (ICSG), pp. 1–4, 2015. DOI: 10.1109/SGCF.2015.7354930.

- [133] J. Zeng, H. W. Ngan, J. Liu, J. Wu, and X. Yu, "Colored petri nets modeling of multi-agent system for energy management in distributed renewable energy generation system," in 2010 Asia-Pacific Power and Energy Engineering Conference, pp. 1–5, 2010. DOI: 10.1109/APPEEC.2010.5448292.
- [134] M. Zidar, P. S. Georgilakis, N. D. Hatziargyriou, T. Capuder, and D. Škrlec, "Review of energy storage allocation in power distribution networks: Applications, methods and future research," *IET Generation, Transmission & Distribution*, vol. 10, no. 3, 2016, pp. 645–652. DOI: 10.1049/iet-gtd.2015.0447.
- [135] S. Zou, I. Hiskens, and Z. Ma, "Consensus-based coordination of electric vehicle charging considering transformer hierarchy," *Control Engineering Practice*, vol. 80, 2018, pp. 138–145. DOI: 10.1016/j.conengprac.2018.08.018.
- [136] R. H. A. Zubo and G. Mokryani, "Active distribution network operation: A market-based approach," *IEEE Systems Journal*, vol. 14, no. 1, 2020, pp. 1405–1416. DOI: 10.1109/JSYST.2019. 2927442.