



Advancements in the integration and optimization of control systems: Overcoming challenges in DCS, SIS, and PLC deployments for refinery automation

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Abstract

The integration and optimization of control systems, including Distributed Control Systems (DCS), Safety Instrumented Systems (SIS), and Programmable Logic Controllers (PLC), are essential for advancing refinery automation. These systems facilitate precise process control, enhance safety, and improve operational efficiency in complex industrial environments. However, their deployment faces significant challenges, including technical issues such as compatibility and scalability, operational hurdles like maintenance and workforce training, and security vulnerabilities arising from interconnected systems. This paper explores the technological landscape of DCS, SIS, and PLC, highlighting recent advancements and integration trends that enhance automation capabilities. It examines the primary challenges associated with system integration and optimization, offering innovative solutions such as adopting open communication standards, utilizing Artificial Intelligence (AI) and the Internet of Things (IoT), and implementing predictive analytics. The paper further outlines best practices for ensuring system reliability, including robust design, proactive maintenance strategies, and comprehensive cybersecurity measures. Strategic recommendations are provided to enable seamless deployment, improve system resilience, and foster sustainability in refinery automation. Refineries can achieve greater efficiency, safety, and competitiveness in an evolving industrial landscape by addressing these challenges and leveraging emerging technologies.

Keywords: Refinery Automation; Distributed Control Systems (DCS); Safety Instrumented Systems (SIS); Programmable Logic Controllers (PLC); Predictive Analytics; Industrial Cybersecurity

1. Introduction

1.1. Overview of Refinery Automation and Its Significance

Refinery automation has become a cornerstone of modern industrial operations, transforming how refineries process and manage hydrocarbons. This paradigm shift is driven by the need to enhance productivity, ensure safety, and minimize operational costs (Schirmeister & Mülhaupt, 2022). Automation involves using advanced control systems to monitor, manage, and optimize complex processes in real time. With global demand for refined products such as gasoline, diesel, and petrochemicals consistently rising, refineries face the challenge of meeting these demands while adhering to stringent environmental regulations and maintaining operational excellence (Jasperneite, Sauter, & Wollschlaeger, 2020).

Automation enables refineries to achieve unparalleled efficiency by reducing human intervention in repetitive and hazardous tasks. By automating process control, facilities can ensure consistent product quality, reduce the likelihood of human error, and increase throughput. Moreover, automation helps in the predictive maintenance of critical

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equipment, identifying potential failures before they lead to costly downtime. As such, refinery automation has become not only a competitive advantage but also a necessity in today's fast-evolving industrial landscape (Wanasinghe et al., 2020).

1.2. Importance of Control Systems in Achieving Operational Efficiency

At the heart of refinery automation are three pivotal control systems: Distributed Control Systems (DCS), Safety Instrumented Systems (SIS), and Programmable Logic Controllers (PLC) (K. Kosmowski & Gołębiewski, 2019). These systems collectively form the backbone of automated operations, ensuring that processes are safe, reliable, and efficient. Distributed Control Systems (DCS) are critical in managing large-scale refinery processes. By distributing control across multiple subsystems, DCS ensures that operations are resilient and scalable. It integrates seamlessly with sensors and actuators to control temperature, pressure, flow, and other critical parameters precisely. DCS is particularly valuable in optimizing continuous processes, such as crude oil distillation, where accuracy and stability are paramount (Radziwill, 2020).

Safety Instrumented Systems (SIS) are designed to protect refineries from catastrophic events. These systems serve as a failsafe, activating emergency protocols when predefined safety thresholds are breached. For instance, an SIS might shut down operations in the event of a gas leak or excessive pressure buildup (Ackerman, 2021). By ensuring that processes operate within safe limits, SIS protects both personnel and assets while minimizing the risk of environmental harm. Programmable Logic Controllers (PLC) are widely used for discrete control and machinery automation. These systems excel in applications requiring quick and precise responses, such as managing conveyor belts or pump operations. PLCs are known for their flexibility and cost-effectiveness, making them integral to refinery automation (Martínez-Parrales & del Carmen Téllez-Anguiano, 2022).

Together, these systems provide a comprehensive framework for achieving operational efficiency. They enable refineries to streamline processes, optimize resource utilization, and ensure compliance with regulatory standards. Their integration allows refineries to operate at peak performance despite fluctuating market conditions and complex operational challenges.

1.3. Objectives of the Paper and Scope of Discussion

This paper aims to explore advancements in the integration and optimization of control systems within refinery automation, focusing on overcoming challenges in deploying DCS, SIS, and PLC. It seeks to provide a nuanced understanding of how these systems can be harmonized to achieve greater efficiency, reliability, and safety in refinery operations.

The scope of this discussion includes an in-depth examination of the technological advancements shaping the landscape of control systems. The paper also delves into the challenges faced in integrating and optimizing these systems, such as interoperability issues, cybersecurity vulnerabilities, and operational complexities. Additionally, it highlights innovative approaches and best practices for addressing these challenges, drawing insights from emerging technologies like artificial intelligence, the Internet of Things (IoT), and predictive analytics.

By synthesizing current knowledge and identifying areas for improvement, this paper aspires to serve as a valuable resource for industry professionals, researchers, and policymakers. It underscores the critical role of control systems in driving refinery automation forward and offers actionable recommendations for enhancing their deployment and performance.

2. Technological Landscape of Control Systems

2.1. Brief Introduction to DCS, SIS, and PLC

Control systems such as Distributed Control Systems (DCS), Safety Instrumented Systems (SIS), and Programmable Logic Controllers (PLC) are indispensable in the modern refinery landscape. These systems collectively enable the seamless automation of processes, ensuring operational efficiency, safety, and reliability (Mohammed, Reinecke, Burnap, Rana, & Anithi, 2022).

Distributed Control Systems (DCS) are designed to manage and control continuous processes in refineries, such as distillation and chemical reactions. A DCS divides the control workload across multiple subsystems, each responsible for specific process areas. This decentralization enhances system resilience and scalability, allowing large-scale refineries to operate efficiently. A DCS ensures real-time monitoring and control by integrating data from numerous

sensors and actuators, maintaining process parameters within precise limits (Miller, Staves, Maesschalck, Sturdee, & Green, 2021).

Safety Instrumented Systems (SIS) are specialized systems that focus on the safety of refinery operations. They operate independently of other control systems to provide additional protection. SIS is programmed to automatically initiate emergency shutdowns, alarms, or corrective actions when predefined safety thresholds are exceeded. This proactive approach safeguards personnel, equipment, and the environment from potential hazards, such as equipment failures, fires, or chemical leaks (K. Kosmowski & Gołębiowski, 2019).

Programmable Logic Controllers (PLC) are versatile, rugged systems that excel in discrete control applications. Unlike DCS, which is optimized for continuous processes, PLCs are suited for tasks requiring rapid decision-making and precise control, such as controlling motors, valves, and conveyor systems (Basem, 2022). Their modular design and programmability make them a cost-effective choice for smaller-scale applications or as supplementary systems in larger refineries. Together, these systems create a robust infrastructure for automating refinery operations. Each system contributes unique strengths, ensuring that processes are efficient, safe, and adaptable to changing conditions (Joshi, Adhikari, Patel, Singh, & Gehlot, 2019).

2.2. Recent Advancements in Each System

The rapid evolution of technology has brought significant advancements to DCS, SIS, and PLC, enhancing their capabilities and reliability. In DCS, edge computing and cloud integration advancements have enabled real-time data analysis and decision-making at the source. Modern DCS architectures now support predictive analytics, allowing operators to anticipate potential disruptions and take preemptive measures. Additionally, the integration of digital twin technology has revolutionized process optimization. By creating virtual replicas of physical systems, operators can simulate scenarios, test control strategies, and optimize performance without disrupting operations.

SIS has seen notable improvements in its ability to enhance safety and reliability. Advances in SIL (Safety Integrity Level) certification standards have led to the development of more robust systems capable of meeting higher safety requirements. Advanced diagnostic tools have improved the accuracy of fault detection and response times. Furthermore, the adoption of cybersecurity protocols has strengthened SIS against external threats, ensuring the integrity of safety-critical functions (K. T. Kosmowski, Śliwiński, & Piesik, 2019).

Processing power and communication protocol advancements have expanded the scope of PLCs' applications. High-speed Ethernet connectivity and compatibility with IoT devices have transformed PLCs into key enablers of smart manufacturing (Hendi & Rashed, 2021). Modern PLCs now support advanced programming languages and visualization tools, simplifying complex automation tasks. Additionally, their integration with AI-driven algorithms has enabled adaptive control, allowing PLCs to self-optimize based on real-time data. These advancements have improved the functionality and reliability of each system and enhanced their ability to work together, paving the way for more integrated and intelligent refinery operations (K. Kosmowski & Gołębiowski, 2019).

2.3. Integration Trends and Their Impact on Refinery Automation

The integration of DCS, SIS, and PLC is a growing trend in refinery automation, driven by the need for unified control and monitoring. This convergence enables seamless communication between systems, creating a holistic view of refinery operations. Advanced integration frameworks, such as OPC UA (Open Platform Communications Unified Architecture), facilitate interoperability between different control systems, irrespective of vendor-specific protocols (Radziwill, 2020). One of the most significant impacts of integration is the ability to implement centralized monitoring and control. Operators gain comprehensive insights into refinery performance by consolidating data from DCS, SIS, and PLC into a unified platform. This approach enhances decision-making, reduces response times, and minimizes the risk of errors.

Integration also supports the implementation of smart technologies, such as AI and IoT. For instance, IoT sensors can feed real-time data into DCS, which then uses AI algorithms to identify anomalies or optimize process parameters. Similarly, SIS can leverage predictive analytics to enhance safety, while PLCs can adjust operations dynamically based on real-time inputs (Aldaheri, Alghazzawi, Cheng, Alzahrani, & Al-Barakati, 2020).

Furthermore, integration enables cost savings through streamlined maintenance and resource allocation. Unified systems reduce the complexity of managing multiple standalone systems, leading to lower operational costs and improved reliability. This particularly benefits refineries operating in highly competitive markets where efficiency and cost control are critical (Ahmad et al., 2022). However, integration also introduces challenges, such as cybersecurity

vulnerabilities and the need for skilled personnel to manage complex systems. Addressing these challenges requires a proactive approach, including the adoption of robust cybersecurity measures and continuous training programs for operators and engineers (Al-Jaroodi, Mohamed, & Abukhousa, 2020).

3. Challenges in Integration and Optimization

3.1. Technical Challenges

The integration and optimization of control systems such as Distributed Control Systems (DCS), Safety Instrumented Systems (SIS), and Programmable Logic Controllers (PLC) are fraught with technical challenges that can hinder seamless operation. Compatibility, scalability, and system latency are the most pressing issues (Radziwill, 2020). Compatibility is a significant obstacle when attempting to integrate different control systems. Refineries often use equipment and software from multiple vendors, each with proprietary communication protocols and configurations. This lack of standardization complicates interoperability between DCS, SIS, and PLC, necessitating the use of middleware or protocol converters. Such solutions, while effective, can add complexity and cost, making integration less efficient. Furthermore, legacy systems in older refineries may not support modern technologies, creating additional compatibility barriers (González, Calderón, Figueiredo, & Sousa, 2019).

Scalability is another critical issue, particularly as refineries expand their operations or adopt new technologies. Control systems must handle increasing data loads and process complexities while maintaining performance. For example, a refinery upgrading its operations to include advanced IoT sensors and real-time analytics may find its existing control systems overwhelmed by the additional data streams. Ensuring that systems remain scalable requires hardware and software enhancements, both of which can be expensive and time-consuming (Sjödin, Parida, Palmié, & Wincent, 2021).

System latency, or delays in data transmission and processing, poses a significant challenge in the context of real-time control. Data must flow seamlessly between integrated systems to ensure accurate and timely decision-making. Latency issues can arise due to inadequate network infrastructure, inefficient communication protocols, or bottlenecks in data processing. These delays can compromise the performance of critical functions, such as emergency shutdowns or process adjustments, leading to reduced operational efficiency or even safety risks (Raptis, Passarella, & Conti, 2019).

3.2. Operational Challenges

Beyond technical hurdles, operational challenges play a substantial role in integrating and optimizing control systems. Maintenance, training, and adaptability are key areas that demand attention to ensure long-term success. Maintenance of integrated systems is inherently more complex than managing standalone components. Each system—DCS, SIS, and PLC—requires specialized expertise and tools for upkeep. In integrated environments, troubleshooting issues becomes more complicated as faults may span multiple systems. Predictive maintenance strategies, enabled by advanced analytics, can mitigate these challenges, but their implementation requires significant upfront investment and ongoing monitoring.

Training is another critical operational challenge. Integrated systems often feature advanced technologies and sophisticated interfaces, requiring operators and engineers to acquire new skills. Inadequate training can lead to operational errors, reduced efficiency, and increased safety risks. The challenge is compounded by workforce turnover, which necessitates continuous training programs to ensure that all personnel are adequately equipped to handle integrated systems (Mourtzis, Angelopoulos, & Panopoulos, 2022).

Adaptability refers to the ability of control systems and personnel to respond effectively to changing operational requirements. Refineries operate in dynamic environments where market demands, regulatory standards, and technological advancements frequently evolve. Integrated systems must be flexible enough to accommodate these changes without significant disruptions. However, achieving this level of adaptability requires robust system design and a workforce capable of implementing changes efficiently. This can be particularly challenging for refineries with limited resources or those operating in highly regulated industries (Tseng, Tran, Ha, Bui, & Lim, 2021).

3.3. Security Challenges

As refineries embrace integration and digitalization, cybersecurity has emerged as a critical challenge. The interconnected nature of DCS, SIS, and PLC creates vulnerabilities that malicious actors can exploit. Vulnerabilities in interconnected systems arise from multiple sources, including outdated software, weak authentication mechanisms, and inadequate data encryption. The integration of legacy systems with modern technologies often exacerbates these vulnerabilities, as older systems may lack built-in security features. Additionally, the use of IoT devices and cloud-based

platforms introduces new attack vectors, increasing the risk of data breaches and system compromises (Stoddart, 2022).

The consequences of cyberattacks on integrated control systems can be severe, ranging from operational disruptions to safety incidents. For example, a targeted attack on a refinery's SIS could disable emergency shutdown protocols, leading to catastrophic outcomes. Similarly, ransomware attacks can paralyze operations by encrypting critical data or locking operators out of control systems.

Refineries must adopt robust cybersecurity measures to address these challenges, including regular software updates, multi-factor authentication, and advanced threat detection systems. The implementation of network segmentation, which isolates critical systems from less secure networks, can also minimize the impact of potential breaches. However, these measures require ongoing investment and expertise, which may be challenging for smaller refineries or those with limited cybersecurity budgets (Mukherjee, 2020).

4. Innovative Approaches to Overcome Challenges

4.1. Solutions for Seamless Integration and Interoperability

Seamless integration and interoperability among Distributed Control Systems (DCS), Safety Instrumented Systems (SIS), and Programmable Logic Controllers (PLC) are critical to achieving efficient refinery automation. Addressing compatibility issues involves adopting open standards and communication protocols, such as OPC UA (Open Platform Communications Unified Architecture), which allow systems from different vendors to communicate effectively. These standards provide a common framework for data exchange, ensuring interoperability without extensive customization (Dey & Sen, 2020).

Another solution lies in middleware platforms specifically designed for industrial automation. These platforms serve as a bridge, translating and normalizing data between systems. They also offer centralized control and monitoring, simplifying the integration process and reducing complexity. Modern middleware solutions often include user-friendly interfaces, enabling operators to configure and manage systems with minimal technical expertise (Zeydan & Mangues-Bafalluy, 2022).

Refineries can also leverage digital twin technology to simulate and test integration scenarios before implementation. A digital twin creates a virtual representation of the refinery's control systems, allowing engineers to identify and address compatibility issues in a controlled environment. This proactive approach minimizes risks and ensures a smoother integration process (Botín-Sanabria et al., 2022).

4.2. Role of AI, IoT, and Predictive Analytics in Optimization

Emerging technologies such as Artificial Intelligence (AI), the Internet of Things (IoT), and predictive analytics are transforming the optimization of integrated control systems. AI enables advanced process control by analyzing vast amounts of data to identify patterns, anomalies, and inefficiencies. For example, AI-driven algorithms can optimize process parameters in real-time, ensuring maximum efficiency and minimal waste. Additionally, AI-powered diagnostic tools enhance fault detection and troubleshooting, reducing downtime and maintenance costs.

IoT devices play a pivotal role in enhancing connectivity and data collection. By deploying IoT sensors across refinery operations, refineries can gather real-time data on temperature, pressure, flow rates, and other critical parameters. This data is then transmitted to DCS, SIS, and PLC, enabling precise control and monitoring. IoT also facilitates remote access to control systems, allowing operators to manage processes from anywhere and improving operational flexibility (Bramantyo, Utomo, & Khusna, 2022).

Predictive analytics takes optimization to the next level by forecasting potential issues before they occur. By analyzing historical and real-time data, predictive models can identify trends and anomalies that signal impending equipment failures or process deviations. This allows refineries to implement preventive measures, avoiding costly downtime and improving overall reliability. For example, predictive maintenance strategies, enabled by AI and IoT, help schedule repairs and replacements at the optimal time, reducing maintenance costs and extending the lifespan of equipment (Seyedan & Mafakheri, 2020). The integration of these technologies also supports the implementation of adaptive control strategies. Refineries can create systems that continuously learn and adapt to changing conditions by combining AI, IoT, and predictive analytics, ensuring optimal performance under varying circumstances.

4.3. Best Practices for Enhancing System Reliability and Resilience

Ensuring the reliability and resilience of integrated control systems in refineries necessitates a blend of technological innovations, operational rigor, and organizational strategies. A robust system design forms the cornerstone of reliability, where selecting hardware and software tailored to refinery-specific needs is crucial. Future-proofing the system through compatibility with upgrades and incorporating redundancy, such as dual redundant processors in DCS, ensures continuity during failures and minimizes downtime.

Cybersecurity measures are vital for protecting these systems against ever-evolving cyber threats. Implementing a multi-layered defense strategy—comprising firewalls, intrusion detection systems, and encryption—safeguards sensitive data and prevents unauthorized access. Regular software updates and security audits further strengthen resilience by addressing new vulnerabilities and ensuring compliance with the latest security standards.

The human factor significantly influences system reliability. Comprehensive training programs for operators and engineers are critical for effectively managing integrated systems. Continuous skill development through education and certification programs ensures that the workforce remains proficient in handling advanced technologies and evolving industry practices. Additionally, incorporating monitoring and diagnostics tools enables real-time performance assessment. Advanced analytics and remote monitoring capabilities empower operators to proactively identify and resolve potential issues, thereby preventing escalations.

Standardized maintenance protocols streamline operations and minimize disruptions. Predictive maintenance, driven by AI and IoT, optimizes service intervals, reduces wear and tear, and extends equipment longevity. Building collaborative ecosystems through partnerships with technology providers and industry experts fosters innovation and facilitates the sharing of proven solutions. Lastly, routine system testing and validation, including simulations and stress tests, are essential for identifying vulnerabilities and ensuring effective redundancy measures. By integrating these best practices, refineries can achieve greater reliability and resilience in their control systems, ensuring seamless and uninterrupted operations.

5. Conclusion

The integration and optimization of control systems like Distributed Control Systems, Safety Instrumented Systems, and Programmable Logic Controllers are vital for refinery automation. These systems enable precise control, real-time monitoring, and efficient management of industrial processes. Despite their advantages, deployment challenges such as technical issues with compatibility and scalability, operational demands for maintenance and training, and security vulnerabilities from interconnected systems must be addressed for successful implementation.

To overcome these challenges, innovative solutions have been proposed. Open communication standards, such as OPC UA and middleware platforms enhance interoperability, simplifying integration. Emerging technologies like Artificial Intelligence, the Internet of Things, and predictive analytics improve fault detection, optimize process control, and enable proactive maintenance. Moreover, robust system design, enhanced cybersecurity measures, and workforce training are crucial in improving system reliability and resilience.

Strategic recommendations further emphasize the need for standardization and leveraging emerging technologies to maximize efficiency. Refineries are encouraged to adopt open protocols and collaborate with vendors for seamless integration. AI, IoT, and predictive analytics should be incorporated to enhance operational performance and reduce downtime. Strengthening cybersecurity through multi-layered strategies, regular audits, and workforce education is essential to mitigate risks.

Additionally, investment in workforce development, proactive maintenance, and collaboration with industry experts is recommended to foster innovation and ensure system sustainability. Regular testing and validation, alongside sustainable practices like energy optimization and waste reduction, can improve environmental performance and operational efficiency. Refineries can achieve enhanced safety, efficiency, and competitiveness in an evolving industrial landscape by addressing these challenges and adopting these strategies.

Compliance with ethical standards

Disclosure of conflict of interest

No conflict of interest to be disclosed.

References

- [1] Ackerman, P. (2021). *Industrial Cybersecurity: Efficiently monitor the cybersecurity posture of your ICS environment*: Packt Publishing Ltd.
- [2] Ahmad, T., Zhu, H., Zhang, D., Tariq, R., Bassam, A., Ullah, F., . . . Alshamrani, S. S. (2022). Energetics Systems and artificial intelligence: Applications of industry 4.0. *Energy Reports*, 8, 334-361.
- [3] Al-Jaroodi, J., Mohamed, N., & Abukhousa, E. (2020). Health 4.0: on the way to realizing the healthcare of the future. *Ieee Access*, 8, 211189-211210.
- [4] Aldhaheri, S., Alghazzawi, D., Cheng, L., Alzahrani, B., & Al-Barakati, A. (2020). DeepDCA: novel network-based detection of IoT attacks using artificial immune system. *Applied Sciences*, 10(6), 1909.
- [5] Basem, M. (2022). Comparing PLC, Software Containers and Edge Computing for future industrial use: a literature review.
- [6] Botín-Sanabria, D. M., Mihaita, A.-S., Peimbert-García, R. E., Ramírez-Moreno, M. A., Ramírez-Mendoza, R. A., & Lozoya-Santos, J. d. J. (2022). Digital twin technology challenges and applications: A comprehensive review. *Remote Sensing*, 14(6), 1335.
- [7] Bramantyo, H. A., Utomo, B. S., & Khusna, E. M. (2022). Data processing for iot in oil and gas refineries. *Journal of Telecommunication Network (Jurnal Jaringan Telekomunikasi)*, 12(1), 48-54.
- [8] Dey, C., & Sen, S. K. (2020). *Industrial automation technologies*: CRC Press.
- [9] González, I., Calderón, A. J., Figueiredo, J., & Sousa, J. M. (2019). A literature survey on open platform communications (OPC) applied to advanced industrial environments. *Electronics*, 8(5), 510.
- [10] Hendi, F., & Rashed, M. H. (2021). Improved Safety: The Importance of Aggregated Safety System. Paper presented at the Abu Dhabi International Petroleum Exhibition and Conference.
- [11] Jasperneite, J., Sauter, T., & Wollschlaeger, M. (2020). Why we need automation models: handling complexity in industry 4.0 and the internet of things. *IEEE Industrial Electronics Magazine*, 14(1), 29-40.
- [12] Joshi, V., Adhikari, M. S., Patel, R., Singh, R., & Gehlot, A. (2019). *Industrial Automation: Learn the current and leading-edge research on SCADA security*: BPB Publications.
- [13] Kosmowski, K., & Gołębiowski, D. (2019). Functional safety and cyber security analysis for life cycle management of industrial control systems in hazardous plants and oil port critical infrastructure including insurance. *Journal of Polish Safety and Reliability Association*, 10.
- [14] Kosmowski, K. T., Śliwiński, M., & Piesik, J. (2019). INTEGRATED FUNCIONAL SAFETY AND CYBERSECURITY. ANALYSIS METHOD FOR SMART MANUFACTURING SYSTEMS. *Task Quarterly*, 23(2), 177-207.
- [15] Martínez-Parrales, R., & del Carmen Téllez-Anguiano, A. (2022). Vibration-based fault detection system with IoT capabilities for a conveyor machine. *Acta Polytechnica Hungarica*, 19(9), 7-24.
- [16] Miller, T., Staves, A., Maesschalck, S., Sturdee, M., & Green, B. (2021). Looking back to look forward: Lessons learnt from cyber-attacks on industrial control systems. *International Journal of Critical Infrastructure Protection*, 35, 100464.
- [17] Mohammed, A. S., Reinecke, P., Burnap, P., Rana, O., & Anthi, E. (2022). Cybersecurity challenges in the offshore oil and gas industry: an industrial cyber-physical systems (ICPS) perspective. *ACM Transactions on Cyber-Physical Systems (TCPS)*, 6(3), 1-27.
- [18] Mourtzis, D., Angelopoulos, J., & Panopoulos, N. (2022). Operator 5.0: A survey on enabling technologies and a framework for digital manufacturing based on extended reality. *Journal of Machine Engineering*, 22.
- [19] Mukherjee, A. (2020). *Network Security Strategies: Protect your network and enterprise against advanced cybersecurity attacks and threats*: Packt Publishing Ltd.
- [20] Radziwill, N. (2020). *Connected, Intelligent, Automated*: Quality Press.
- [21] Raptis, T. P., Passarella, A., & Conti, M. (2019). Data management in industry 4.0: State of the art and open challenges. *Ieee Access*, 7, 97052-97093.
- [22] Schirmeister, C. G., & Mülhaupt, R. (2022). Closing the carbon loop in the circular plastics economy. *Macromolecular rapid communications*, 43(13), 2200247.

- [23] Seyedan, M., & Mafakheri, F. (2020). Predictive big data analytics for supply chain demand forecasting: methods, applications, and research opportunities. *Journal of Big Data*, 7(1), 53.
- [24] Sjödin, D., Parida, V., Palmié, M., & Wincent, J. (2021). How AI capabilities enable business model innovation: Scaling AI through co-evolutionary processes and feedback loops. *Journal of Business Research*, 134, 574-587.
- [25] Stoddart, K. (2022). *Cyberwarfare: Threats to Critical Infrastructure*: Springer Nature.
- [26] Tseng, M.-L., Tran, T. P. T., Ha, H. M., Bui, T.-D., & Lim, M. K. (2021). Sustainable industrial and operation engineering trends and challenges Toward Industry 4.0: A data driven analysis. *Journal of Industrial and Production Engineering*, 38(8), 581-598.
- [27] Wanasinghe, T. R., Gosine, R. G., James, L. A., Mann, G. K., De Silva, O., & Warriar, P. J. (2020). The internet of things in the oil and gas industry: a systematic review. *IEEE Internet of Things Journal*, 7(9), 8654-8673.
- [28] Zeydan, E., & Mangués-Bafalluy, J. (2022). Recent advances in data engineering for networking. *Ieee Access*, 10, 34449-34496.