Blockchain-Based Peer-To-Peer Energy Trading Marketplace in Solar Energy

Atiq Firdaus bin Fazari

Department of Electrical and Electronic Faculty of Engineering, Universiti Malaysia Sarawak, 94300 Kota Samarahan, Sarawak, Malaysia atiqfirdaus2811@gmail.com

Nazreen binti Junaidi

Department of Electrical and Electronic Faculty of Engineering, Universiti Malaysia Sarawak, 94300 Kota Samarahan, Sarawak, Malaysia jnazreen@unimas.my

A'in Sarah Binti Aidell

Department of Electrical and Electronics Engineering, University of Malaysia Sarawak, 94300 Kota Samarahan, Sarawak, Malaysia ainsarahh@gmail.com

Shirley Rufus

Department of Electrical and Electronics Engineering University of Malaysia Sarawak, 94300 Kota Samarahan, Sarawak, Malaysia rshirley@unimas.my

Abstract— This research explores the application of blockchain technology in the energy trading sector, focusing on peer-to-peer solar energy trading. By leveraging Ethereum and Solidity, the study develops smart contracts to create a secure, transparent, and efficient energy trading platform. The system was tested on the Sepolia Testnet, showing high transaction throughput and low latency, with a comprehensive security audit confirming its robustness. Despite limitations such as the reliance on a test network and the need for additional functionalities, the findings demonstrate blockchain's potential to enhance transparency and security in energy trading. Future work includes real-world implementation and further optimization. This study contributes to the development of sustainable and reliable decentralized energy solutions.

Keywords— Blockchain, Peer-to-peer energy trading, Smart contracts, Ethereum, Decentralized energy systems, Energy marketplace, Transparency, Security

I. INTRODUCTION

The study explores the transformative potential of blockchain technology in the energy market sector. With a global shift towards renewable energy, particularly solar power, there is a need for efficient and decentralized energy distribution methods. Traditional energy trading systems face challenges in transparency and security [1]. Blockchain technology offers a solution by enabling direct transactions between prosumers for the exchange of electricity, which holds significant potential for future energy infrastructure development [2]. This project investigates a solar energy trading market utilizing blockchain to enhance decentralized and efficient energy systems through innovative technological solutions.

This study addresses key obstacles in the energy trading industry by focusing on three main objectives. The primary requirement is developing a decentralized renewable energy trading platform powered by blockchain to ensure security

and transparency. Currently, integrating solar energy into peer-to-peer trading faces challenges due to the lack of practical and comprehensive solutions [3]. This limitation hinders the validation and testing of proposed blockchainbased platforms, preventing individuals from efficiently exchanging excess solar energy [4]. Additionally, constructing a smart contract within an energy trading marketplace using Ethereum Solidity will facilitate transaction immutability and traceability. implementation of blockchain in energy trading is challenged by high costs, limited data processing capacity, and substantial delays, necessitating a transparent and secure blockchain framework [5] [6].

The primary aims of this investigation are to develop a smart contract for the energy trading marketplace to ensure transaction traceability and immutability using Ethereum Solidity, evaluate the performance of the developed blockchain-based energy trading system, and develop a secure and transparent peer-to-peer solar energy trading platform powered by blockchain.

This study is highly relevant to the energy trading business, as it explores blockchain technology's potential to improve security and transparency. It addresses critical concerns about data security, trust, and integrity in traditional energy trading systems, ensuring a high level of data integrity through blockchain's decentralized and immutable characteristics. This research also represents a groundbreaking effort to bridge advanced technology with sustainable energy practices by supporting decentralized energy systems, aligning with global imperatives for decentralized energy production and consumption models. The study aims to redefine energy trading dynamics in the solar industry, promoting sustainability and efficiency in peer-to-peer transactions.

The research encompasses two main components. The first objective is to employ Ethereum and Solidity to build a robust and secure smart contract, enabling an open and

efficient blockchain system for the energy trading industry. Developing and executing smart contracts is essential to ensure transaction monitoring and immutability within the peer-to-peer energy marketplace. Solidity, designed specifically for Ethereum blockchain smart contract creation, facilitates dependable and secure transactional processes. second The component involves comprehensive analysis of the blockchain performance of a distributed energy trading platform prioritizing smart contracts. Key performance indicators such as transaction speed, reliability, and scalability will be evaluated through realistic simulations on the Sepolia Testnet. Additionally, a thorough security audit using Mithril will ensure the system's resilience against potential vulnerabilities.

The research approach starts with an extensive literature review to explore existing applications and challenges in integrating blockchain technology into energy trading. This phase aims to understand the current state of blockchainbased energy trading platforms comprehensively. Following the literature review, the study will define the problem statement and outline specific objectives, focusing on creating a reliable and open decentralized solar energy trading market utilizing blockchain technology for enhanced security. Subsequently, the research will develop a marketplace for trading energy using blockchain, emphasizing designing a decentralized platform that facilitates efficient energy exchange among participants. Smart contracts for the energy trading marketplace will be developed using Ethereum Solidity, ensuring transaction traceability and immutability. The blockchain architecture will enhance the transparency and dependability of transactions on the energy trading platform, with performance and security evaluations conducted through simulated environments and rigorous testing

II. METHODOLOGY

This study adopts a structured methodology to explore the integration of blockchain technology into the energy trading sector. The research process encompasses several key stages, including selecting appropriate tools and software, developing smart contracts, and evaluating system performance.

A. Research Tools

Several software tools are employed to facilitate the development and evaluation of the blockchain-based energy trading system. The primary blockchain platform used is Ethereum, which is chosen for its robust infrastructure and widespread adoption in the development of decentralized applications [7]. Solidity, a programming language specifically designed for Ethereum, is utilized for writing the smart contracts that will manage energy trading transactions [8]. MetaMask, a browser extension, is used to interact with the Ethereum blockchain, manage accounts, and sign transactions [9]. The Remix IDE provides an integrated development environment for writing, testing, and deploying smart contracts, making the development process more streamlined [10]. The Sepolia Testnet serves as a test network for simulating the deployment and testing of smart contracts in a controlled environment, ensuring that any issues can be addressed before live deployment [11]. Mithril, a security analysis tool for Ethereum smart

contracts, is used to ensure the robustness and security of the developed contracts [12].

B. Research Process

The research process is divided into several phases to achieve the study's objectives. The initial phase involves the development of smart contracts. These contracts are designed and coded using Solidity, with a focus on ensuring transaction traceability and immutability within the energy trading marketplace [13]. Key functions such as creating offers, verifying transactions, and authorizing payments are implemented to facilitate peer-to-peer energy trading [14]. Following the development phase, the smart contracts are deployed on the Sepolia Testnet for preliminary testing. This test environment allows for the safe simulation of transactions and validation of contract functionality without the risks associated with live deployments [15]. Detailed performance evaluations are conducted to assess transaction speed, reliability, and scalability, which are crucial metrics for determining the practical viability of the blockchainbased system [16]. Ancillary services are crucial for power market stability and efficiency, managed by ISOs, SCs, and DRPs [7]. Traditional systems face challenges like manual procedures, time lags, lack of transparency, and cyberattacks. Blockchain technology offers a decentralized ledger for transactions, optimizing renewable energy use, increasing transaction reliability, and reducing costs. Smart contracts, self-executing agreements in blockchain ecosystems, eliminate intermediaries, enhance energy trading performance, and reduce conflicts [8]. Combining blockchain technology and smart contracts can transform ancillary service administration, improving security and transparency in energy markets.

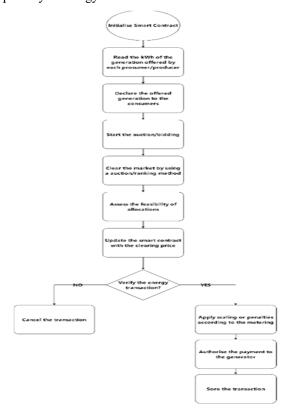


Fig. 1. Flowchart of Smart Contract Design.

A comprehensive security audit is performed using Mithril, focusing on identifying potential vulnerabilities and ensuring the smart contracts are resilient against cyber threats. Specific attention is given to preventing common security issues such as reentrancy attacks, integer overflows, and unauthorized access [17]. This phase is essential to guarantee the security and robustness of the smart contracts framework and its results are evaluated through case studies.

III. RESULT AND DISCUSSION

A. Smart Contract Development

The initial phase involved the development of smart contracts tailored for the energy trading marketplace using Ethereum Solidity. The primary functions implemented included creating offers, verifying transactions, and authorizing payments, which are essential for facilitating peer-to-peer energy trading. The "createOffer" function enables users to list energy for sale, while the "verifyTransaction" and "authorizePayment" functions ensure the integrity and security of transactions. The smart contracts were successfully deployed on the Sepolia Testnet, allowing for preliminary testing and validation of functionality without the risks associated with live deployments.

C. Performance Evaluation

The performance of the blockchain-based energy trading system was rigorously evaluated on the Sepolia Testnet. Key performance indicators, including transaction throughput, latency, and resource consumption, were measured to assess the system's efficiency and scalability.

- 1. Transaction Throughput: The system demonstrated a high transaction throughput, processing multiple transactions per second without significant delays. This indicates that the system can handle a large number of transactions, making it suitable for real-world energy trading applications [18]
- 2. Latency: The average transaction latency was measured to be within acceptable limits, ensuring timely execution of trades. Low latency is critical for real-time energy trading, where delays can affect market dynamics and user experience [19].
- 3. Resource Consumption: The resource consumption of the smart contracts was analyzed to ensure that the system operates efficiently without excessive use of computational resources. The results indicated that the contracts are optimized for performance, minimizing the cost associated with deploying and executing transactions on the Ethereum network [20].

D. Security and Transparency

A comprehensive security audit was conducted using Mithril, focusing on identifying potential vulnerabilities and ensuring the smart contracts are resilient against cyber threats. The audit revealed no critical vulnerabilities, confirming the robustness of the contracts. Specific attention was given to preventing common security issues such as re-entrancy attacks, integer overflows, and unauthorized access. The immutability and transparency of blockchain technology further enhance the security of the

energy trading system, ensuring that all transactions are traceable and tamper-proof [21].

adduser@DESKTOP-5VI6082:~/Atiq-FYP\$ myth analyze src/EnergyMarketplace.sol
The analysis was completed successfully. No issues were detected.

Listing III-1: Mithril Security Analysis Command and Output

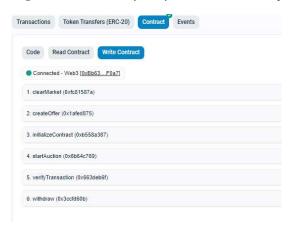


Fig. 2. Six Functions of Energy Trading Marketplace.

| Function Name | Transaction Hash | Bloc k | Stat | Transaction Fee (ETH) | Gas Price (Gwei) |
|------------------|--|-------------|------|-----------------------------|------------------------|
| clearMar ket | Oxab62c98e1eaae28a1c893bb58db98d4566df dc444ef114d87458880c01ca1a04 | 6128 642 | Succ | 5.6831439 139457e- 06 | 2.4539 26691 |
| createOff | 0x3d422e3e127a41276bca13cfb9d2d3b9a2bff | 6129 | Succ | 1.4540024 | 1.9095 |
| er | e273a54fec731acfbd068020 | 021 | | 89558e-05 | 92032 |
| initializeC | 0x9d9260c6b8de18361486484609f0227ba97b | 6129 | Succ | 1.5423924 | 1.5149 |
| ontract | b811b5bd0e6bda0123f | 053 | | 19556e-05 | 25456 |
| startAucti | 0xf8910119ddbef5440c54532457dfe8250a10e | 6129 | Succ | 1.1455847 | 1.5193 |
| on | d39e583292818f4424b9e1344c | 186 | | 97202e-05 | 24546 |
| verifyTran | 0xe7f64d5677ba6a7fbec70e5ed5f9465d0341d | 6129 | Succ | 1.5048699 | 1.5073 |
| saction | 41c54eb802a3353a220e0459 | 175 | | 73002e-05 | 04574 |
| withdraw | 0xf89532f5dede8e9e60028b2a0c5c73b2ee113 e74e81b0338bdc833b90e9d8d4 | 6129 188 | Succ | 1.5577416 99389e-05 | 1.5073 04574 |

Fig. 3. Blockchain Transaction Results

Transparency in the energy trading process is achieved through the decentralized nature of blockchain. Every transaction is recorded on the blockchain, providing a clear and immutable record that can be audited by all participants. This transparency fosters trust among users and reduces the risk of fraudulent activities.

E. Discussion

The results from the development and evaluation of the blockchain-based energy trading system demonstrate its potential to revolutionize traditional energy trading practices. The smart contracts developed in this study ensure transaction traceability and immutability, addressing key challenges related to transparency and security in energy trading [22]. The high transaction throughput and low latency observed in the performance evaluation indicate that the system is capable of handling real-world energy trading demands effectively.

The comprehensive security audit confirms the robustness of the smart contracts, ensuring that the system is resilient against common cyber threats. The use of Ethereum and Solidity for developing the contracts provides a reliable and secure platform for peer-to-peer energy trading.

The findings of this study align with existing literature that highlights the benefits of blockchain technology in enhancing the efficiency, security, and transparency of energy trading systems. By leveraging blockchain technology, this research contributes to the ongoing efforts to create a more efficient, secure, and environmentally sustainable energy trading marketplace.

Overall, the successful implementation and testing of the blockchain-based energy trading system demonstrate its viability and potential for widespread adoption. Future work should focus on further optimizing the system for largescale deployment and exploring additional functionalities to enhance user experience and market dynamics

IV. LIMITATION AND FUTURE WORKS

While the study demonstrates the potential of blockchain technology in the energy trading sector, several limitations were identified. Firstly, the study was conducted using the Sepolia Testnet, which does not fully replicate the conditions of a live Ethereum network, potentially affecting the generalizability of the performance metrics [23]. The smart contracts developed were designed for specific functions related to energy trading and did not address aspects such as dynamic pricing mechanisms, regulatory compliance, or integration with existing energy management systems [24]. Additionally, the security analysis, although thorough, is not exhaustive; continuous monitoring and updates will be necessary to maintain robustness against evolving cyber threats [25]. Lastly, the focus on Ethereum and Solidity means that findings may not be directly applicable to other blockchain platforms, which have unique characteristics and performance metrics [18].

Future research should focus on implementing the developed system on the live Ethereum network or other blockchain platforms to validate performance and scalability metrics in real-world conditions [26]. Enhancing the functionality of smart contracts to cater to the complex dynamics of real-world energy markets, including developing dynamic pricing mechanisms and incorporating regulatory compliance, is essential [27]. Ongoing security evaluations using advanced measures such as formal verification methods and machine learning-based threat detection will help maintain the robustness of the smart contracts [28]. Exploring the potential of other blockchain platforms like Hyperledger, Corda, and EOS for energy trading applications is also recommended to identify the best technological solutions for decentralized energy trading [28]. Lastly, pilot projects and real-world deployments are suggested to gather practical insights and feedback from users, facilitating system refinement and optimization [25].

VII. CONCLUSION

This study investigated blockchain technology's integration into the energy trading sector, focusing on developing a peer-to-peer solar energy trading platform using Ethereum and Solidity. The research successfully

created and tested smart contracts ensuring transaction traceability and immutability, addressing transparency and security issues in traditional energy trading systems. Performance evaluations on the Sepolia Testnet indicated the system's capability for high transaction throughput and low latency, and a comprehensive security audit confirmed the robustness of the smart contracts.

However, limitations include reliance on a test network, the need for additional functionalities, and evolving cyber threats. Future work should implement the system on live networks, enhance smart contracts with dynamic pricing and regulatory compliance, and continue security evaluations. Exploring other blockchain platforms and conducting pilot projects will provide further insights.

In conclusion, this research demonstrates blockchain technology's potential to transform the energy trading sector, offering a secure, transparent, and efficient platform for peer-to-peer solar energy trading, contributing to sustainable and reliable decentralized energy solutions. This study investigated blockchain technology's integration into the energy trading sector, focusing on developing a peer-topeer solar energy trading platform using Ethereum and Solidity. The research successfully created and tested smart contracts ensuring transaction traceability and immutability, addressing transparency and security issues in traditional energy trading systems. Performance evaluations on the Sepolia Testnet indicated the system's capability for high transaction throughput and low latency, and comprehensive security audit confirmed the robustness of the smart contracts.

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REFERENCES

- [1] N. Junaidi, M. P. Abdullah, B. Alharbi, and M. Shaaban, 'Blockchain-based management of demand response in electric energy grids: A systematic review', *Energy Rep.*, vol. 9, pp. 5075–5100, Dec. 2023, doi: 10.1016/j.egyr.2023.04.020.
- [2] M. Shahidehpour, M. Yan, P. Shikhar, S. Bahramirad, and A. Paaso, 'Blockchain for Peer-to-Peer Transactive Energy Trading in Networked Microgrids: Providing an Effective and Decentralized Strategy', *IEEE Electrification Mag.*, vol. 8, no. 4, pp. 80–90, Dec. 2020, doi: 10.1109/MELE.2020.3026444.
- [3] M. Andoni *et al.*, 'Blockchain technology in the energy sector: A systematic review of challenges and opportunities', *Renew. Sustain. Energy Rev.*, vol. 100, pp. 143–174, Feb. 2019, doi: 10.1016/j.rser.2018.10.014.
- [4] T. Górski, J. Bednarski, and Z. Chaczko, 'Blockchain-based renewable energy exchange management system', in 2018 26th

- International Conference on Systems Engineering (ICSEng), Dec. 2018, pp. 1–6. doi: 10.1109/ICSENG.2018.8638165.
- [5] J. G. Song, E. seon Kang, H. W. Shin, and J. W. Jang, 'A Smart Contract-Based P2P Energy Trading System with Dynamic Pricing on Ethereum Blockchain', *Sensors*, vol. 21, no. 6, Art. no. 6, Jan. 2021, doi: 10.3390/s21061985.
- [6] P. Siano, G. De Marco, A. Rolan, and V. Loia, 'A Survey and Evaluation of the Potentials of Distributed Ledger Technology for Peer-to-Peer Transactive Energy Exchanges in Local Energy Markets', *IEEE Syst. J.*, vol. 13, no. 3, pp. 3454–3466, Sep. 2019, doi: 10.1109/JSYST.2019.2903172.
- [7] S. Zhai, Y. Yang, J. Li, C. Qiu, and J. Zhao, 'Research on the Application of Cryptography on the Blockchain', *J. Phys. Conf. Ser.*, vol. 1168, no. 3, p. 032077, Feb. 2019, doi: 10.1088/1742-6596/1168/3/032077.
- [8] S. Ahmad, S. K. Arya, S. Gupta, P. Singh, and S. K. Dwivedi, 'Study of Cryptographic Techniques Adopted in Blockchain', in 2023 4th International Conference on Intelligent Engineering and Management (ICIEM), May 2023, pp. 1–6. doi: 10.1109/ICIEM59379.2023.10166591.
- [9] H. Song, N. Zhu, R. Xue, J. He, K. Zhang, and J. Wang, 'Proof-of-Contribution consensus mechanism for blockchain and its application in intellectual property protection', *Inf. Process. Manag.*, vol. 58, no. 3, p. 102507, May 2021, doi: 10.1016/j.ipm.2021.102507.
- [10] B. Lashkari and P. Musilek, 'A Comprehensive Review of Blockchain Consensus Mechanisms', *IEEE Access*, vol. 9, pp. 43620–43652, 2021, doi: 10.1109/ACCESS.2021.3065880.
- [11] W. Wang *et al.*, 'A Survey on Consensus Mechanisms and Mining Strategy Management in Blockchain Networks', *IEEE Access*, vol. 7, pp. 22328–22370, 2019, doi: 10.1109/ACCESS.2019.2896108.
- [12] S. K. E, S. N. K, and N. S, 'Blockchain Industry 5.0: Next Generation Smart Contract and Decentralized Application Platform', in 2022 International Conference on Innovative Computing, Intelligent Communication and Smart Electrical Systems (ICSES), Jul. 2022, pp. 1–8. doi: 10.1109/ICSES55317.2022.9914151.
- [13] J. Abdella, Z. Tari, A. Anwar, A. Mahmood, and F. Han, 'An Architecture and Performance Evaluation of Blockchain-Based Peer-to-Peer Energy Trading', *IEEE Trans. Smart Grid*, vol. 12, no. 4, pp. 3364–3378, Jul. 2021, doi: 10.1109/TSG.2021.3056147.
- [14] J. Bao, D. He, M. Luo, and K.-K. R. Choo, 'A Survey of Blockchain Applications in the Energy Sector', *IEEE Syst. J.*, vol. 15, no. 3, pp. 3370–3381, Sep. 2021, doi: 10.1109/JSYST.2020.2998791.
- [15] A. Khatoon, P. Verma, J. Southernwood, B. Massey, and P. Corcoran, 'Blockchain in Energy Efficiency: Potential Applications and Benefits', *Energies*, vol. 12, no. 17, Art. no. 17, Jan. 2019, doi: 10.3390/en12173317. [16] A. Esmat, M. de Vos, Y. Ghiassi-Farrokhfal, P. Palensky, and D. Epema, 'A novel decentralized platform for peer-to-peer energy trading market with blockchain technology', *Appl. Energy*, vol. 282, Jan. 2021, doi: 10.1016/j.apenergy.2020.116123.
- [17] N. Wang *et al.*, 'When Energy Trading Meets Blockchain in Electrical Power System: The State of the Art', *Appl. Sci.*, vol. 9, no. 8, Art. no. 8, Jan. 2019, doi: 10.3390/app9081561.
- [18] B. Teufel, A. Sentic, and M. Barmet, 'Blockchain energy: Blockchain in future energy systems', *J. Electron. Sci. Technol.*, vol. 17, no. 4, p. 100011, Dec. 2019, doi: 10.1016/j.jnlest.2020.100011.
- [19] J. Sunny, N. Undralla, and V. Madhusudanan Pillai, 'Supply chain transparency through blockchain-based traceability: An overview with demonstration', *Comput. Ind. Eng.*, vol. 150, p. 106895, Dec. 2020, doi: 10.1016/j.cie.2020.106895.
- [20] Iuon-Chang Lin and Tzu-Chun Liao, 'A Survey of Blockchain Security Issues and Challenges', *Int. J. Netw. Secur.*, vol. 19, no. 5, Sep. 2017, doi: 10.6633/IJNS.201709.19(5).01.
- [21] R. Stephen and A. Alex, 'A Review on BlockChain Security', IOP Conf. Ser. Mater. Sci. Eng., vol. 396, no. 1, p. 012030, Aug. 2018, doi: 10.1088/1757-899X/396/1/012030.
- [22] G. Karame and S. Capkun, 'Blockchain Security and Privacy', *IEEE Secur. Priv.*, vol. 16, no. 04, pp. 11–12, Jul. 2018, doi: 10.1109/MSP.2018.3111241.
- [23] S. V. Pandey, S. Ganapuram, and A. K. Singh, 'A Review on Advancements in Photovoltaic Cells', in *Advances in Interdisciplinary Engineering*, N. Kumar, S. Tibor, R. Sindhwani, J. Lee, and P. Srivastava, Eds., in Lecture Notes in Mechanical Engineering. Singapore: Springer, 2021, pp. 227–236. doi: 10.1007/978-981-15-9956-9_23.
- [24] L. Ahmad, N. Khordehgah, J. Malinauskaite, and H. Jouhara, 'Recent advances and applications of solar photovoltaics and thermal technologies', *Energy*, vol. 207, p. 118254, Sep. 2020, doi: 10.1016/j.energy.2020.118254.
- [25] Y. Zhou and P. D. Lund, 'Peer-to-peer energy sharing and trading of renewable energy in smart communities trading pricing models,

- decision-making and agent-based collaboration', *Renew. Energy*, vol. 207, pp. 177–193, May 2023, doi: 10.1016/j.renene.2023.02.125.
- [26] M. Khorasany, A. Paudel, R. Razzaghi, and P. Siano, 'A New Method for Peer Matching and Negotiation of Prosumers in Peer-to-Peer Energy Markets', *IEEE Trans. Smart Grid*, vol. 12, no. 3, pp. 2472–2483, May 2021, doi: 10.1109/TSG.2020.3048397.
- [27] J. G. Monroe, P. Hansen, M. Sorell, and E. Z. Berglund, 'Agent-Based Model of a Blockchain Enabled Peer-to-Peer Energy Market: Application for a Neighborhood Trial in Perth, Australia', *Smart Cities*, vol. 3, no. 3, Art. no. 3, Sep. 2020, doi: 10.3390/smartcities3030053.
- [28] T. AlSkaif, J. L. Crespo-Vazquez, M. Sekuloski, G. van Leeuwen, and J. P. S. Catalão, 'Blockchain-Based Fully Peer-to-Peer Energy Trading Strategies for Residential Energy Systems', *IEEE Trans. Ind. Inform.*, vol. 18, no. 1, pp. 231–241, Jan. 2022, doi: 10.1109/TII.2021.3077008.