

Digital Transformation in Operations Management: Leveraging Technology to Improve Business Efficiency

Desman Serius Nazara¹, Agung Sutrisno², Nersiwad³, Mohammad Muslimin⁴

Akademi Kebidanan Harapan Keluarga¹, IAIN Parepare², Universitas Islam Majapahit³

Email : Desmannazara870@gmail.com¹, agungsutrisno@iainpare.ac.id², nersiwad@unim.ac.id³, muslimin.4ndr1@gmail.com⁴

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ABSTRAK

Digital transformation in operations management has become an urgent need for companies to improve efficiency, productivity, and competitiveness in the face of an increasingly complex and competitive business environment. Digital technologies such as the Internet of Things (IoT), artificial intelligence (AI), robotics, and big data provide opportunities for companies to optimize various aspects of operations. This article aims to explore how digital transformation can be applied in operations management to support these goals. The research method used is a literature review, where various previous studies and industry reports are analyzed to identify the benefits, challenges, and impacts of digital technology implementation on business operations. The results show that the implementation of digital technology enables companies to speed up workflows, reduce costs, improve process accuracy, and prepare the foundation for continuous innovation. In the discussion, it is also explained that although there are challenges in terms of investment costs, training, and data security, companies that successfully overcome these barriers will gain a significant competitive advantage. The implications of these findings are the importance of continued investment in technology and human capital development, as well as the adoption of sustainability strategies to support long-term growth.

Keywords.: Digital Transformation, Operational Management, Business Efficiency

Introduction

The rapid development of digital technologies in recent decades has fundamentally altered the global business landscape, driving changes in almost every aspect of a company's operations. No longer just a trend, digital transformation is now an essential element in modern business strategies (Behie, 2023). Companies from various industry sectors are competing to integrate digital technologies to achieve key objectives such as operational efficiency, cost reduction, and increased competitiveness in an increasingly competitive and dynamic market (Abbas, 2024). Advanced technologies such as the Internet of Things (IoT), artificial intelligence (AI), big data, cloud computing, and automation have created significant new opportunities for organizations to manage resources, processes, and operations in a smarter, faster, and more accurate way (Paramesha, 2024). IoT allows companies to connect devices and systems in an integrated network, enabling real-time monitoring and control of production processes (Rath, 2024). This improves an organization's ability to detect and respond to operational issues before they impact production, while optimizing the use of energy and resources.

Digital transformation in operations management is not just about moving manual processes to automation (Van, 2023). It involves a cultural shift, the adoption of new technology tools, and the application of deep data analytics to optimize business decisions. Data collected from various operations processes can be used to predict market needs, forecast machine failures, and improve operational resilience. These applications enable management



to be more responsive to changes and can provide faster solutions in dynamic situations. It also helps businesses manage resources more efficiently, lower production costs, and increase productivity. In the digital era, artificial intelligence or AI also plays an important role in operations management (Camacho, 2024). AI is capable of automating complex processes, performing predictive analysis, and even assisting in faster decision-making. In production operations, AI can be used to control quality, analyze production trends, and predict labor needs (Mathew, 2023). With sophisticated algorithms, AI also enables companies to detect anomalies that might cause operational losses, so that preventive measures can be taken immediately. It also helps in cost optimization, as AI can recommend a more efficient allocation of resources and reduce wastage (Kothamali, 2022).

Big data and cloud computing also enable data storage and analysis on a large scale, allowing companies to utilize data from multiple sources to gain deeper insights into operations and markets (Adaga, 2023). The use of cloud technology in operations management cannot be ignored either. Cloud technology enables global data access and collaboration, making coordination between teams in different locations easier. In a cloud-integrated system, information can be accessed by interested parties anytime and anywhere, so decisions can be made faster and more responsive to current situations. Cloud computing also provides flexibility for companies to adjust capacity as needed without having to incur large costs for physical infrastructure (Islam, 2023). With easier access to data, companies can analyze information in real-time, monitor performance, and respond to changes efficiently.

Digital transformation not only provides more sophisticated tools for companies, but also changes the way they operate and innovate (Moghrabi, 2023). With the right technology adoption, companies can not only increase efficiency and lower costs, but also create new value, accelerate response to market changes, and improve customer satisfaction. Operational management, which includes the management of resources, production, supply chain, and distribution of products and services, plays a central role in the changes taking place in the digital transformation era (Ning, 2023). Efficient operational management is key for companies to maintain competitiveness in the midst of increasingly fierce competition and evolving consumer needs. Digital transformation in the context of operational management provides great opportunities for companies to innovate in running business processes, by utilizing technology to increase efficiency, reduce costs, and speed up production and distribution time (Vendraminelli, 2023).

Digital transformation enables the optimization of the use of resources, whether human, machine, or material. With the application of data analytics and artificial intelligence (AI), companies can analyze consumption patterns and market demand in more detail, thereby adjusting the use of resources as needed (Mhlanga, 2023). Technology also enables automation of processes that previously required manual intervention, reducing the risk of human error and speeding up workflows. For example, in supply chain management, digital technologies such as blockchain can be used to increase transparency and security, ensure that every step in the supply chain process is properly tracked, and reduce the risk of disruption. Digital transformation also supports more informed and accurate decision-making. With the availability of rich and deep data from various operational processes, companies can use advanced analytics to predict market trends, consumer demand, and production efficiency. This data-driven decision-making helps companies respond to changes in the market more quickly and precisely, allowing them to dynamically adjust operational strategies (Zhu, 2023). This speed in responding to market dynamics gives companies a significant competitive advantage, especially in fast-moving industries such as manufacturing, logistics and technology.

Companies that manage to effectively implement digital technologies in operations management can gain a variety of competitive advantages, including increased productivity, flexibility, and the ability to respond more quickly to market changes (Kolasani, 2023). Increased productivity can be achieved through automation of previously time-consuming

processes, as well as through reduced downtime in factories and optimization of workflows. Operational flexibility also increases as companies can easily adjust production and distribution according to fluctuations in demand, without experiencing major disruptions. Digital transformation also enables faster innovation, as companies can react to consumer feedback or technological changes at a greater speed. Operational management supported by digital technology not only improves efficiency, but also opens up opportunities for companies to become more adaptive and innovative (Meena, 2024). On the other hand, the adoption of digital technologies also presents its own challenges. Organizations must deal with the complexity of integrating new technologies into existing infrastructure, the need for training and skills development for the workforce, and the growing threat of cybersecurity. Digital transformation also requires changes in organizational culture, where innovation and adaptation are key elements in dealing with rapid changes in the global market (Bozkus, 2023). This research aims to examine the impact of digital transformation on operational management by highlighting how technology can be used to improve efficiency, productivity and overall performance. In addition, this article will also discuss the challenges companies face in the technology adoption process as well as strategies that can be used to overcome these barriers. Through this study, it is hoped to provide a deeper insight into the important role of digital transformation in optimizing operational management in the modern technology driven era.

Method

This research uses a qualitative approach to explore the role of digital transformation in operations management, with a particular focus on the utilization of cutting-edge technologies such as the Internet of Things (IoT), artificial intelligence (AI), big data, cloud computing, and automation. Digital transformation has become a key factor in improving operational efficiency and productivity across various industry sectors, so this study seeks to understand how companies can effectively integrate such technologies into operational processes. The research method used in this article is a literature review approach, which aims to understand the role of digital transformation in improving the efficiency of business operations management. An in-depth literature review is conducted to collect theoretical data and insights related to digital transformation and its application in operations management. The literature sources reviewed include leading academic journals, reference books, recent industry reports, and relevant articles that discuss technological developments. This literature review aims to identify key trends in the adoption of digital technologies, including an analysis of the potential benefits, such as increased efficiency, reduced costs and improved service quality. It also focuses on uncovering the challenges that companies often face in adopting digital technologies, such as the need for organizational restructuring, improved human resource competencies, and significant investments in technology infrastructure. With this approach, the research seeks to make an important contribution to the understanding of the dynamics of digital transformation in the context of business operations and offer relevant insights for practitioners in designing appropriate technology adoption strategies.

Results and Discussion

This research shows that digital transformation in operational management has brought significant positive impacts, especially in improving the efficiency, productivity and competitiveness of companies in various industrial sectors. The application of digital technologies enables companies to not only meet cost-efficiency and production improvement targets, but also to create a strong foundation for long-term growth and continuous innovation required in an increasingly dynamic business environment. Research findings underscore that advanced technologies, such as the Internet of Things (IoT), artificial intelligence (AI), robotics, and big data, play an important role in optimizing various aspects of operations (Adel, 2024). IoT enables real time monitoring of machine and inventory conditions, thereby reducing

the risk of operational failures and speeding up production flow (Khan, 2024). Artificial intelligence (AI), on the other hand, enables the automation of complex processes and provides accurate predictive capabilities based on historical data analysis, allowing companies to respond more effectively to market demands (Sullivan, 2024). In addition, the application of big data provides deep insights for data-driven decision-making, enabling companies to identify patterns, understand market trends, and optimize operational performance. Technology enables companies to process large amounts of data quickly, providing reliable analysis to improve efficiency and reduce operational errors (Ajiga, 2024).

Digital transformation impacts sustainability, as more efficient technologies enable reduced energy consumption and waste, ultimately leading to greener operations (Liao, 2024). In the long run, companies that adopt digital transformation not only gain competitive advantages in terms of cost and speed, but can also adapt quickly to market and regulatory changes. The adoption of digital technologies ultimately helps companies become more flexible and responsive, as they have access to real-time information that allows them to respond more effectively to customer demands, supply chain changes or operational challenges. Thus, this digital transformation not only provides operational advantages but also strengthens the company's position in an increasingly complex and competitive market (Feng, 2024).

In the manufacturing industry, the use of IoT sensors integrated with production systems has enabled real-time monitoring of machines (Adeleke, 2024). This monitoring not only helps identify potential machine breakdowns before they occur, but also enables predictive maintenance, so that production downtime can be minimized. As such, plant productivity can be significantly improved, while reducing costs associated with sudden repairs or replacement of machine components. These efficiencies also contribute to optimizing the use of resources, including energy and raw materials, resulting in a reduction in overall operating costs. In addition, automation implemented in the logistics sector, utilizing AI technology and big data analytics, has enabled increased accuracy in predicting market demand. Through the analysis of massive consumer data, companies are able to identify consumption trends and purchasing patterns more precisely, thus being able to plan product distribution more efficiently. This distribution optimization not only helps reduce delivery time and transportation costs, but also allows companies to respond more quickly to changing consumer needs. AI-based algorithms can forecast demand fluctuations in specific markets and direct product distribution to more appropriate locations, reducing the risk of stock-outs or overstocking. In addition to improving operational efficiency, digital transformation also strengthens the competitiveness of companies (Sui, 2024). Companies that successfully adopt digital technologies strategically can more easily adapt to dynamic market changes and are able to provide better services to customers. In the retail sector, integration between e-commerce platforms, data analytics, and cloud-based inventory management systems enables more responsive supply chain management and a more personalized customer experience (Brown, 2024). This not only increases customer loyalty, but also enables companies to maintain a competitive position in an increasingly digitized market.

The adoption of technologies such as IoT, AI, and automation provides great opportunities for companies to achieve operational excellence and create greater added value for customers (Ozbiltekin, 2024). In addition, digital transformation has a very significant impact on data-driven decision-making, changing the way companies manage information and formulate business strategies. By leveraging big data technology and real-time data analytics, companies can now comprehensively collect, store and analyze operational data from multiple sources. This large-scale data processing enables managers and stakeholders to make more accurate, faster, and evidence-based decisions, thereby minimizing the risk of errors and increasing the company's responsiveness to rapid market changes. In the retail industry, predictive analytics plays an important role in helping companies manage supply chains and

inventory more efficiently (Gopal, 2024). By analyzing consumer buying patterns, sales seasons, and market trends, companies can more accurately project product demand. This not only helps reduce storage costs associated with overstocking, but also allows companies to respond to spikes in demand more quickly, avoiding costly out-of-stock situations. Furthermore, these analytics can also be used to adjust pricing strategies, promotions, and special offers based on customer behavior and current market conditions.

Data driven decision making also strengthens a company's ability to innovate. Through analysis of market trends and consumer behavior, companies can identify new opportunities for product or service development, as well as optimize business processes to be more adaptive to changing market demands (Kushariyadi, 2024). In the financial sector, big data analytics are used to develop more accurate risk models, enabling banks and financial institutions to assess credit risk and manage investment portfolios more effectively. While in the manufacturing sector, real-time data allows companies to perform predictive maintenance on machines, reduce downtime, and improve production efficiency (Agustina, 2024). The application of big data and real time analytics in decision-making has strengthened management capabilities in various industry sectors, creating opportunities for improved operational performance and corporate competitiveness. With more accurate and real-time information, companies can act more proactively, responsively and strategically in facing business challenges in the digital era.

While digital transformation brings many benefits, the research also reveals significant challenges faced by companies in the adoption process. One of the key challenges is the integration of new technologies with legacy infrastructure, otherwise known as legacy systems. Many companies, especially those that have been operating for a long time, are still using outdated IT systems that are not designed to interact with modern technologies such as big data, cloud computing, or artificial intelligence (AI). Integrating these new technologies with legacy infrastructure is a major challenge as it often requires a complete update of existing systems (George, 2024). Another challenge is related to workforce skills. Digital transformation demands very different skills compared to traditional jobs. Employees must be able to operate and understand digital technologies, analyze data, and manage automation systems (Zhang, 2024). This shortage of digital skills creates a significant gap between technological demands and the capabilities of the existing workforce, slowing down the adoption of new technologies (Hughes, 2024). To overcome these challenges, companies need to invest significant resources in training and developing the skills of their workforce. Intensive and continuous training is crucial to ensure employees can adapt to the ever-evolving technological changes. Many companies require digital skills development programs, such as training in data analytics, automation, use of management software, as well as other specialized skills relevant to their respective industries. However, this training also presents its own challenges, both in terms of cost and time. There is also the need to create a work culture that is adaptive to change, where employees are not only open to new technologies, but are also able to collaborate in a work environment that is increasingly driven by data and automation. Beyond technology and skills challenges, there are organizational and leadership challenges. Digital transformation often requires structural changes within organizations, where traditional hierarchies may need to be overhauled to support more dynamic and cross-functional work processes. In addition, visionary leadership that is open to innovation is also indispensable to guide the company through this major change. Without strong support from top management, digital transformation can be hampered by internal resistance and lack of clear strategic direction.

Conclusion

Digital transformation in operational management has proven to be one of the key factors supporting the improvement of efficiency, productivity, and competitiveness of companies in various industrial sectors. The implementation of cutting-edge technologies such as the Internet

of Things (IoT), artificial intelligence (AI), big data, and cloud computing has had a very significant impact on the way companies run operations. These technologies not only help optimize business processes, but also enable companies to manage resources more efficiently, reduce operational costs, and accelerate data-driven decision-making through real-time analytics. Overall, digital transformation has become the foundation for companies that want to stay relevant and competitive in the industry 4.0 era. The adoption of technologies such as IoT, AI, big data, and cloud computing not only offers increased efficiency and productivity, but also opens up opportunities for companies to continue to innovate, adapt to market changes, and create sustainable added value for customers. Companies that are able to leverage digital transformation well will be in a stronger position to face future challenges and create lasting competitive advantage. However, the adoption of digital transformation also faces challenges, particularly in terms of the integration of new technologies with legacy infrastructure, the need for digital skills training for the workforce, and cybersecurity concerns. While these challenges are significant, companies that can overcome them will gain an important competitive advantage in an increasingly connected and competitive global market. The implication of digital transformation in operations management is that companies need to continue investing resources in new technologies to maintain competitiveness and relevance in the market. Investments in employee training and technology infrastructure should be prioritized to ensure that the implementation of digital technology can run effectively. In addition, companies need to improve data security as the increasing use of digital systems potentially increases the risk of cyber threats.

Bibliography

- Abbas, J., Balsalobre-Lorente, D., Amjid, M. A., Al-Sulaiti, K., Al-Sulaiti, I., & Aldereai, O. (2024). Financial innovation and digitalization promote business growth: The interplay of green technology innovation, product market competition and firm performance. *Innovation and Green Development*, 3(1), 100111. <https://doi.org/10.1016/j.igd.2023.100111>
- Adaga, E. M., Okorie, G. N., Egieya, Z. E., Ikwue, U., Udeh, C. A., DaraOjimba, D. O., & Oriekhoe, O. I. (2023). The role of big data in business strategy: a critical review. *Computer Science & IT Research Journal*, 4(3), 327-350. <https://doi.org/10.51594/csitrj.v4i3.686>
- Adel, A. (2024). The convergence of intelligent tutoring, robotics, and IoT in smart education for the transition from industry 4.0 to 5.0. *Smart Cities*, 7(1), 325-369. <https://doi.org/10.3390/smartcities7010014>
- Adeleke, A. K. (2024). Intelligent monitoring system for real-time optimization of ultra-precision manufacturing processes. *Engineering Science & Technology Journal*, 5(3), 803-810. <https://doi.org/10.51594/estj.v5i3.904>
- Agustina, D., Fitri, F., Zilrahmi, Z., Winanda, R. S., & Sari, D. P. (2024, August). Utilization of machine learning for predictive maintenance in improving productivity in manufacturing industry. In *AIP Conference Proceedings* (Vol. 3123, No. 1). AIP Publishing. <https://doi.org/10.1063/5.0224329>
- Ajiga, D., Okeleke, P. A., Folorunsho, S. O., & Ezeigweneme, C. (2024). The role of software automation in improving industrial operations and efficiency. <https://doi.org/10.53430/ijeru.2024.7.1.0031>
- Behie, S. W., Paman, H. J., Khan, F. I., Shell, K., Alarfaj, A., El-Kady, A. H., & Hernandez, M. (2023). Leadership 4.0: The changing landscape of industry management in the smart digital era. *Process safety and environmental protection*, 172, 317-328. <https://doi.org/10.1016/j.psep.2023.02.014>

- Bozkus, K. (2023). Organizational Culture Change and Technology: Navigating the Digital Transformation. <https://doi.org/10.5772/intechopen.112903>
- Brown, W.; Johnson, O.; Wilson, G. Influence of E-Commerce Technologies on Supply Chain Management in Retail. Preprints 2024, 2024071140. <https://doi.org/10.20944/preprints202407.1140.v1>
- Camacho, N. G. (2024). The Role of AI in Cybersecurity: Addressing Threats in the Digital Age. *Journal of Artificial Intelligence General science (JAIGS)* ISSN: 3006-4023, 3(1), 143-154. <https://doi.org/10.60087/jaigs.v3i1.75>
- Feng, C., & Ali, D. A. (2024). The Impact of Digital Transformation on Optimising Organisational Efficiency. *Accounting and Corporate Management*, 6(2), 109-115. <https://dx.doi.org/10.23977/acccm.2024.060214>
- George, A. S., & Baskar, T. (2024). Driving Business Transformation Through Technology Innovation: Emerging Priorities for IT Leaders. *Partners Universal Innovative Research Publication*, 2(4), 01-14. <https://doi.org/10.5281/zenodo.13286732>
- Gopal, P. R. C., Rana, N. P., Krishna, T. V., & Ramkumar, M. (2024). Impact of big data analytics on supply chain performance: an analysis of influencing factors. *Annals of Operations Research*, 333(2), 769-797. <https://link.springer.com/article/10.1007/s10479-022-04749-6>
- Hughes, H. P., & Davis, M. C. (2024). Preparing a graduate talent pipeline for the hybrid workplace: rethinking digital upskilling and employability. *Academy of Management Learning & Education*, (ja), amle-2023. <https://doi.org/10.5465/amle.2023.0106>
- Islam, R., Patamsetti, V., Gadhi, A., Gondu, R. M., Bandaru, C. M., Kesani, S. C., & Abiona, O. (2023). The future of cloud computing: benefits and challenges. *International Journal of Communications, Network and System Sciences*, 16(4), 53-65. <https://doi.org/10.4236/ijcns.2023.164004>
- Khan, A., Jhanjhi, N. Z., Haji, D. H. T. B. A., & Omar, H. A. H. B. H. (2024). Internet of Things (IoT) Impact on Inventory Management: A Review. *Cybersecurity Measures for Logistics Industry Framework*, 224-247. <https://doi.org/10.4018/978-1-6684-7625-3.ch008>
- Kolasani, S. (2023). Innovations in digital, enterprise, cloud, data transformation, and organizational change management using agile, lean, and data-driven methodologies. *International Journal of Machine Learning and Artificial Intelligence*, 4(4), 1-18. <https://jmlai.in/index.php/ijmlai/article/view/35>
- Kothamali, P. R., Mandalaju, N., & Dandyala, S. S. M. (2022). Optimizing Resource Management in Smart Cities with AI. *Unique Endeavor in Business & Social Sciences*, 1(1), 174-191.
- Kushariyadi, K., Yani, I., Silamat, E., Sari, T. N., & Aulia, M. R. (2024). Analysis of The Influence of Market Consumption Behavior and Economic Conditions on SME Business Performance. *International Journal of Engineering, Science and Information Technology*, 4(3), 35-40. <https://doi.org/10.52088/ijesty.v4i3.521>
- Liao, F., Hu, Y., Chen, M., & Xu, S. (2024). Digital transformation and corporate green supply chain efficiency: Evidence from China. *Economic Analysis and Policy*, 81, 195-207. <https://doi.org/10.1016/j.eap.2023.11.033>
- Mathew, D., Brintha, N. C., & Jappes, J. W. (2023). Artificial intelligence powered automation for industry 4.0. In *New Horizons for Industry 4.0 in Modern Business* (pp. 1-28). Cham: Springer International Publishing. https://link.springer.com/chapter/10.1007/978-3-031-20443-2_1
- Meena, A., Dhir, S., & Sushil, S. (2024). Coopetition, strategy, and business performance in the era of digital transformation using a multi-method approach: Some research implications for strategy and operations management. *International Journal of Production Economics*, 270, 109068. <https://doi.org/10.1016/j.ijpe.2023.109068>

- Mhlanga, D. (2023). Artificial intelligence and machine learning for energy consumption and production in emerging markets: a review. *Energies*, 16(2), 745. <https://doi.org/10.3390/en16020745>
- Moghrabi, I. A., Bhat, S. A., Szczuko, P., AlKhaled, R. A., & Dar, M. A. (2023). Digital transformation and its influence on sustainable manufacturing and business practices. *Sustainability*, 15(4), 3010. <https://doi.org/10.3390/su15043010>
- Ning, L., & Yao, D. (2023). The Impact of digital transformation on supply chain capabilities and supply chain competitive performance. *Sustainability*, 15(13), 10107. <https://doi.org/10.3390/su151310107>
- Ozbiltekin-Pala, M., Kazancoglu, Y., Kumar, A., Garza-Reyes, J. A., & Luthra, S. (2024). Analyzing critical factors of strategic alignment between operational excellence and Industry 4.0 technologies in smart manufacturing. *The TQM Journal*, 36(1), 161-177. <https://doi.org/10.1108/TQM-07-2022-0232>
- Paramesha, M., Rane, N. L., & Rane, J. (2024). Big data analytics, artificial intelligence, machine learning, internet of things, and blockchain for enhanced business intelligence. *Partners Universal Multidisciplinary Research Journal*, 1(2), 110-133. <https://doi.org/10.5281/zenodo.12827323>
- Rath, K. C., Khang, A., & Roy, D. (2024). The role of Internet of Things (IoT) technology in Industry 4.0 economy. In *Advanced IoT technologies and applications in the industry 4.0 digital economy* (pp. 1-28). CRC Press.
- Sui, X., Jiao, S., Wang, Y., & Wang, H. (2024). Digital transformation and manufacturing company competitiveness. *Finance Research Letters*, 59, 104683. <https://doi.org/10.1016/j.frl.2023.104683>
- Sullivan, Y., & Wamba, S. F. (2024). Artificial intelligence and adaptive response to market changes: A strategy to enhance firm performance and innovation. *Journal of Business Research*, 174, 114500. <https://doi.org/10.1016/j.jbusres.2024.114500>
- Van Doorn, S., Georgakakis, D., Oehmichen, J., & Reimer, M. (2023). Opportunity or threat? Exploring middle manager roles in the face of digital transformation. *Journal of Management Studies*, 60(7), 1684-1719. <https://doi.org/10.1111/joms.12880>
- Vendraminelli, L., Macchion, L., Nosella, A., & Vinelli, A. (2023). Design thinking: strategy for digital transformation. *Journal of Business Strategy*, 44(4), 200-210. <https://doi.org/10.1108/JBS-01-2022-0009>
- Zhang, J., & Chen, Z. (2024). Exploring human resource management digital transformation in the digital age. *Journal of the Knowledge Economy*, 15(1), 1482-1498. <https://link.springer.com/article/10.1007/s13132-023-01214-y>
- Zhu, X., & Li, Y. (2023). The use of data-driven insight in ambidextrous digital transformation: How do resource orchestration, organizational strategic decision-making, and organizational agility matter?. *Technological Forecasting and Social Change*, 196, 122851. <https://doi.org/10.1016/j.techfore.2023.122851>