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Strategic E-Procurement and AI Integration: Pioneering Solutions for Global Service Sector Challenges



Abstract: - This research article investigates challenges and innovative procurement approaches within the Service Sector. Specifically, through the lens of ten diverse global companies within the service sector, where traditional processes are being transformed through procurement software, yet complexity in implementing procurement software is ever on the rise with the need for customization, integration, user adoption and compliance with regulation and security. Add to this, the cost implications and constant improvements in technology and a picture of the challenges faced is painted. This study examines the multifaceted challenges faced by companies operating in the service sector and how they implement innovative strategies to overcome challenges. The study looks at the challenges, solutions that have been designed and implemented and how successful they have been. A detailed analysis of ten individual cases, utilities transformers to entertainment, and impact of collaborative strategies and organizational culture on how successful these have been presented. The results provide for a richer understanding of procurement challenges and innovative approaches that can be applied and provide insight into success and failure and reasons why, with technology integration, strategy collaboration and organizational cultures providing keys to success. Additionally, gaps in the literature that lead to areas of further study are presented.

Keywords: service sector, procurement software, collaborative strategies, procurement challenges, strategic collaboration, technology integration

1. INTRODUCTION

The procurement landscape is experiencing tremendous change, catalyzed by technological innovations, which is creating new challenges and opportunities for organizations across industries. This revolution, often referred to as Procurement 4.0, involves the integration of digital technologies, such as e-procurement technologies, into the traditional procurement process that is involved in buying goods and services by leveraging attributes, organizational characteristics, and the environmental factors (Sjödin et al., 2023; Riauan et al., 2022). Moreover, the dynamic environment also led to an expansion and distortion of the traditional boundaries of the organizations due to the emergence of open innovation and collaborative strategies, which led to a distributed innovation process, which reach beyond organizational boundaries (Podmetina et al., 2018;). Thus, collaboration has emerged as a critical driver for technological innovations, which in turn have significant consequences for sustainability across different businesses (Bui et al., 2022). The technological innovations also present challenges and opportunities for alliance management and innovation under uncertainty (Bouncken & Gudergan, 2022.), and in turn, the innovation challenges that are presented by the need to ensure the efficacy of such non-financial measures. This requires a multi-disciplinary approach to facilitate the establishment and operation of ecollaboration ecosystems that relies on computer science and ecosystem management to assist firms in leveraging statistical data from different sources to facilitate effective alliance management and enhance such non-financial innovation performance in collaborative ventures. Importantly, leadership has been shown to play an important role in the initiation of organizational innovation, with both transformational and transactional leadership being shown to enhance organizational innovation (Prasad & Junni, 2016). However, the rapid pace of technological innovations and financial innovations generated by those innovations has placed unprecedented pressures on the development of financial institutions and banks in developing economies (Bhullar & Gupta, 2017), and the transition to a bioeconomy, which is being constructed with the support of technology development and industry convergence, presents major challenges of transformation to incumbent industries (Mossberg et al., 2021). In short, the procurement landscape is being revolutionized by technological innovations, organizational imperatives, and collaborative approach, which are forcing organizations to rethink conventional ways of working.

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This revolution requires a holistic approach that integrates digital technologies, fosters collaboration, and addresses the innovation and uncertainty challenges that organizations are now facing. As organizations pursue this transformation, their capacity to comprehend the multi-faceted nature of these changes and adapt to the demands of Procurement 4.0 will shape their survival and growth in the years ahead.

Global E-Procurement Trends and Insights

E-procurement tools, also known as electronic procurement tools, are digital platforms or software solutions that facilitate the procurement process for organizations. These tools enable businesses to streamline and automate various procurement activities, such as sourcing, supplier management, purchasing, and payment processing. From a global perspective, e-procurement tools have gained significant popularity and adoption due to their potential to enhance efficiency, reduce costs, and improve transparency in procurement operations.

Several studies and reports have highlighted the benefits and impact of e-procurement tools on organizations worldwide. For instance, a study by McKinsey & Company found that e-procurement can lead to cost savings of up to 15% in procurement spend².

The 2023 Global Chief Procurement Officer (CPO)³ Survey illuminates the effectiveness of e-procurement tools, showing notable cost savings and efficiency gains in leading organizations. It reveals that only 30% of CPOs achieved their cost-saving goals, highlighting the challenges in realizing planned savings and at the same time emphasizing the need and imperative for e-procurement tools to enhance procurement efficiency, drive immediate cost savings and effectively manage supplier relationships.

Furthermore, research conducted by the Aberdeen Group revealed that organizations using e-procurement tools experience an average of 27% reduction in procurement cycle times and a 23% decrease in administrative costs. These findings indicate the significant impact of e-procurement tools on operational efficiency and cost optimization.

In terms of global adoption, a report by Grand View Research suggests that the global e-procurement market size was valued at \$5.5 billion in 2020 and is expected to reach \$9.2 billion by 2028, growing at a compound annual growth rate (CAGR) of 7.1% from 2021 to 2028. This indicates the increasing recognition and adoption of e-procurement tools across various industries and regions.⁴

With the backdrop of e-procurement adoption growth and the tangible benefits that organizations are realizing, there is a significant transformation underway in how businesses manage business-to-business (B2B) procurement. Companies are in the midst of not only adopting e-procurement tools, but integrating these platforms into other business systems for a more unified procurement experience. The landscape of procurement in the business-to-business (B2B) sector has witnessed a notable shift, particularly with companies increasingly relying on procurement software for their purchasing needs. This trend has implications for traditional marketplaces, as evidenced by Amazon Business, which identified the market opportunity and strategically invested in digital procurement integrations. The objective was to enable B2B buyers to seamlessly transition from ordering products on Amazon Business to completing their transactions within the marketplace. A statistical snapshot from February 2023 reveals that nearly 70 percent of Amazon Business integrations pertain to general procurement tools, underlining the platform's commitment to facilitating comprehensive solutions in the procurement domain (**Statista 2024**).

² McKinsey. (2019, December 16). Digital MRO procurement: New solutions for capturing and sustaining more value. McKinsey & Company.

³ 2023 Global Chief Procurement Officer (CPO) Survey, Orchestrators Value" Deloitte.

⁴ "Verified Market Research. (2022, April 27). Procurement Software Market: By Type (Cloud, On-Premises), By Application (School, Factory, Hospital), and By Geography.





A 2022 survey conducted in the United States sheds light on the prevalent challenges faced by B2B buyers in the procurement process. Among the top five concerns, 43 percent of respondents highlighted issues related to reliable delivery, while 40 percent grappled with compliance processes, particularly in the context of tail spending. Additionally, 31 percent of surveyed B2B buyers expressed the need for improvement in procurement tools, citing overly complex purchase systems as an impediment (**Statista 2024**).





Further insights into the significance of electronic tools in procurement processes emerge from a 2019 survey focusing on German companies and organizations. Notably, 64.4 percent of respondents who implemented a uniform ordering process were acutely aware of the importance of electronic tools for requisition-to-pay (R2P) processes. This indicates a heightened recognition of the role that dedicated platforms play in streamlining the supply and purchase of products or services across different franchises or departments, emphasizing the practicality and utility of such solutions in a structured procurement environment.



Source: Statista 2024

Shifting focus to the broader context of global e-commerce, the revenue projections for the U.S. market from 2023 to 2028 showcase a robust growth trajectory, with an anticipated increase of 67.47 percent, culminating in an estimated peak of 1.5 trillion U.S. dollars in 2028 (Statista 2024). This sustained growth aligns with the overarching trend witnessed in the e-commerce sector over the past decade.



Source: Statista, 2024

Examining the revenue distribution on a global scale in 2022, China emerges as the leader in the E-commerce market with a revenue of 885.94 billion U.S. dollars, followed closely by the United States at 789.01 billion U.S. dollars. In stark contrast, Indonesia occupies a lower position with 35.77 billion U.S. dollars, emphasizing the substantial gap in e-commerce revenue between leading nations in this domain (Statista 2024).



Source: Statista, 2024

In recent years, the landscape of various industries has been rapidly reshaped due to the advent of Generative artificial intelligence (AI) technologies. In this way, the recent KPMG⁵ report is paramount, unveiling how generative AI will transform procurement. The transformative potential highlighted by the KPMG report notes that there were up to 80%-time savings in specific use cases in its pilot program. The result is projected efficiencies include substantial reduction in cycle times and administrative expenses, which could yield annual cost savings from 0.6–4.0%. The report also underscores the shift in procurement tasks with 50–80% of the tasks moved to be potentially automated, eliminated, or moved to self-service, and translates into significant ROI and operational efficiency for the organization.

Literature Review

The literature on e-procurement tools covers a wide range of dimensions in regard to the adoption, impact, challenges, and implications for a variety of stakeholders. This literature places significant emphasis on the factors associated with adoption, critical success factors, and impacts on organizational characteristics (Barajei, 2023), cost reduction (Ramdani et al., 2009), supply chain management (Liu et al., 2017), customer relationship management (Wei et al., 2014), and the integration of internet-based information technology across various stages of procurement (Yusni, 2022). For instance, Croom & Brandon-Jones (2007) placed much emphasis on system specification and the acquisition process, alongside impacts on organizational characteristics (Gardenal, 2013; Afolabi et al., 2019), acquisition cost, and its impact on governance structure. The work of Khorana et al. (2014) placed emphasis on the identification of critical success factors as well as the drivers of the e-procurement system, focusing on cost reduction and buyer-vendor relationships (Quesada et al., 2010).

The application of Artificial Intelligence (AI) in different domains has been the subject of extensive investigation and debate. In agriculture, AI has been considered a disruptive technology, helping to respond to major challenges such as climate change, population growth, unemployment, and food security (Patel, 2023). Similarly, in the context of supply chain resilience, AI is considered to help achieve greater transparency, last-mile delivery, personalized solutions, minimizing disruptions, and agile procurement strategy (Modgil et al., 2021). Nevertheless, enablers of e-procurement were identified as a need for better-integrated systems that do not cause problems with standards and are not clunky when integrated into like-type systems (Salifu et al., 2022). Challenges of AI procurement in the public sector were brought to the fore, highlighting differences between private and public procurement, and identifying associated challenges (McBride et al., 2021). Further, government sector eprocurement implementation was suggested to be challenged by software integration and data management, as well as by legal and administrative procedures, information technology infrastructure, outsourcing contracts, and IT skills (hardinata & Kamaludin, 2022). The impact that e-procurement can have on customer relationship management was also placed under scrutiny, illuminating benefits and potential risks for implementing such solutions (Smith, 2009). The potential of public procurement as a grand societal, environmental, and economic challenge when used in a strategic way was underscored in the literature as well (Pouikli, 2020). In addition, the challenges and governance issues in the EU's e-procurement framework were identified, from data privacy and security to implementing technology well with governance (Khorana et al., 2014). The capability of eprocurement in small and medium enterprises was underscored as a means of enhancing effectiveness, efficiencies, and quality of service (Fernandes & Vieira, 2015).

In sum, the literature review provides insights on the transformative potential of AI across domains. (Rangraju S. et al., 2023) the challenges in the implementation of e-procurement, and the potential of public procurement as a means of strategic response, underscoring the need to work through integration challenges, legal and administrative procedures, and governance mechanisms to better realize the potential of AI and e-procurement.

Ibem et al. (2018) delve into the factors and challenges that moderated e-procurement adoption within the Nigerian building industry, including its implications. Similarly, Afolabi et al. (1984) discuss the quality changes in Nigerian traditionally processed freshwater fish species to underscore e-procurement's role in quality control and its ramifications for multiple stakeholders. Further contributing to the area of history, Lange et al. (2020) enlighten the diversity of experience of childbirth in relation to brain aging patterns within middle and older-aged women across regions, as a historical process that resonates with understanding determinants of suppliers' performance

⁵ KPMG (2023) Unleashing the Power of Generative AI in Procurement. Retrieved from [https://kpmg.com/kpmg-us/content/dam/kpmg/pdf/2023/unleashing-power-gen-ai-in-procurement.pdf].

within e-procurement systems. Together, these establish e-procurement's role within the enhancement of operational efficiencies across service systems, quality of products, and overall levels of satisfaction among stakeholders in different sectors.

A literature also exists discussing the challenges, as well as moderating factors related to e-procurement adoption, where user experience dimensions are delved into by Hashim et al. (2022), citing satisfaction, security, transparency, efficiency, and reliability as essential (Ofori & Fuseini, 2020). The impact of electronic reverse auctions, in a cultural context of e-procurement, was also explored by Hawkins & Gravier (2016), identifying potential procurement innovation possibilities, in addition to the necessity of culturally tailored strategies (Shiferaw-Mitiku-Tebeka & Yessuf, 2019). Contributing to the extant literature are studies by Albano et al. (2008), As-Saber et al. (2014), and Sánchez-Rodríguez, Hemsworth et al. (2019), who offer insights into suppliers' performance determinants in e-procurement; promises and perils of embracing social media in public e-procurement; and the impact of e-procurement on small and medium-sized enterprises (SMEs), respectively (Mohungoo et al., 2020). These studies deepen the comprehension of e-procurement tools and their implications for various stakeholders, offering an enduring platform on which to build the current research (Abdulatif et al., 2022).

Research Gaps

While the existing literature on e-procurement and AI integration offers comprehensive insights into the adoption factors, success metrics, and overall impact on cost reduction and supplier performance (Barajei, 2023; Ramdani et al., 2009; Lin et al., 2023), there is a notable scarcity in studies specifically addressing the nuanced impacts of AI-driven e-procurement on strategic decision-making and organizational adaptability in the service sector. Although Zhao & Strotmann (2021) and Kumar & Reinartz (2018) discuss AI's role in enhancing decision-making and process automation, these studies predominantly focus on technical and operational perspectives without delving deeply into strategic implications.

Furthermore, the research tends to overlook the multifaceted ways in which AI-enabled e-procurement can contribute to an organization's ability to respond to market volatility and changing consumer demands, particularly in service-oriented industries. While Schneller & Smeltzer (2018) and Jones & Lockwood (2017) explore the benefits of e-procurement in healthcare and hospitality sectors, they do not specifically examine how AI integration in e-procurement tools can enhance organizational agility and customer responsiveness, crucial factors in these dynamic sectors.

Despite significant strides in understanding the integration of e-procurement and AI within the service sector, as well as identifying the multifaceted challenges and innovative strategies employed by global companies, there remains a notable gap in the literature regarding the longitudinal impact of these technologies on procurement processes and outcomes. Specifically, there is a paucity of empirical research examining the long-term effects of strategic e-procurement and AI integration on organizational performance, including cost-efficiency, supplier relationship management, and procurement agility. Addressing these research gaps could significantly advance our understanding of strategic e-procurement and AI integration, offering a roadmap for future studies to explore the long-term impacts, the role of emerging technologies, organizational capabilities for innovation, and comparative effectiveness of AI models in transforming procurement practices within the global service sector. The current study provides valuable insights into the strategies adopted by service sector companies to overcome procurement challenges.

Research Methodology

In this research, a comprehensive case study analysis has been done to delve into the process of digitalization within the service sector's value chain. The idea to consider not only the perspective of organizations but also the interfaces and implications on other actors in the supply chain. By integrating the viewpoints of multiple actors, the research presents a holistic overview of the digitalization process, shedding light on various dimensions of analysis. To explore the managerial challenges faced by companies in their journey towards digitalization of e-procurement processes, a multiple case study approach was employed. This research design allows to compare and identify emerging patterns of relationships among constructs, providing valuable insights into the contextual phenomenon. The study encompasses data from 10 globally recognized service sector companies, chosen based on their industry diversity and global presence. By including companies from various industries such as entertainment, finance, and aviation, the research brings a comprehensive and diverse range of perspectives.

Case No	Profile of the Companies
Case 1	The company is a full-service public utility company that provides electric, water, wastewater, and natural gas services. It has 7 divisions, 379 units, and close to 1,000 suppliers.
Case 2	A global airline company
Case 3	A global entertainment company
Case 4	A financial services company based out of the U.K., which provides credit, savings, and mortgages to nearly four million members across the country,
Case 5	A U.Sbased telecom company, annual revenue of \$2.1 billion and employes around 5,000 people
Case 6	Housing and Urban Development's Real Estate Assessment Center
Case 7	A major U.S. bank with revenues exceeding \$80 billion and 200,000-plus employees across more than 5,000 branches
Case 8	A premier financial services company, with assets \$60 billion and operating in over 10 states in the United States
Case 9	The client is a global hotel and leisure company that owns, operates and manages hotels, resorts, spas, residences and vacation properties. It employs a workforce of more than 150,000 across 1,300 properties around the globe and generates annual revenues of more than \$3 billion.
Case 10	One of the largest providers of public services with APAC regional headquarters in Australia and an annual spend of over US\$ 229 million in Australia and New Zealand

 Table 1: Profiles of the companies discussed in the article.

The research was undertaken by doing an extensive collection of case studies, prioritizing qualitative richness and contextual relevance. This approach enabled to capture the intricate details of each organization's digitalization journey and the associated challenges. The analysis framework involved a systematic classification of the challenges faced by these organizations into three distinct levels: basic, moderate, and significant. This framework allows for a nuanced understanding of the organizational hurdles encountered during the digitalization process. For each identified challenge, the corresponding interventions executed by the companies were examined. By measuring and investigating the outcomes of these interventions, a pragmatic view of their effectiveness has been provided. This analysis sheds light on the strategies employed by companies to overcome digitalization obstacles. Through comprehensive case study analysis, the research aims to uncover valuable insights into the path towards digitalization in the service sector. By considering multiple perspectives and employing a rigorous research methodology, the research provides a professional and in-depth understanding of the complexities associated with this transformative process.



Figure 1: Research Phase showing analysis of the case studies, prepared by the authors using Whimsical.

Research Questions

RQ-1 Fundamental Challenges in Procurement:

What are the common fundamental challenges faced by organizations in their procurement processes, and how do these challenges impact overall efficiency and cost-effectiveness?

RQ2 Strategies for Overcoming Procurement Complexity:

How do organizations effectively address and overcome complex challenges in procurement, such as integration issues, lack of visibility, and disparate buying processes, to enhance strategic sourcing, cost savings, and risk management?

RQ3 Impact of Technology in Procurement Transformations:

To what extent do organizations leverage technological solutions, such as unified procurement platforms, AIdriven analytics, and automation tools, in transforming their procurement functions, and what measurable impacts do these technological interventions have on efficiency and savings?

RQ4 Achieving Procurement Maturity:

What are the key factors and interventions that contribute to the evolution of procurement functions from basic cost-saving measures to strategic, centralized, and globally aligned operations, ensuring compliance, scalability, and continuous improvement?

These research questions aim to explore different dimensions of procurement challenges, interventions, and the overall transformation journey, providing a comprehensive understanding of how organizations navigate and enhance their procurement processes.

Findings, Analysis and Discussions:

Level 1 Challenges - Basic Complexity:

In the foundational tier of challenges, organizations grappled with fundamental impediments that impeded procurement efficiency. Case 1, representing a Full-Service Public Utility Company, confronted basic complexities characteristic of its industry, including a pronounced lack of visibility into cost drivers for utility-scale transformers. The challenges extended to hindrances in supplier negotiations, exacerbated by the intricate nature of the company's operations. Likewise, Case 3, depicting a Global Entertainment Company, faced the fundamental challenge of managing three ERP systems, and it necessitated a technology-driven solution to optimize spend analysis and categorization. The HUD's Real Estate Assessment Center (Case 6), classified as a government agency, encountered basic hurdles in obtaining pricing for property inspections and grappled with a time-consuming traditional procurement process inherent in bureaucratic structures. Major U.S. Bank (Case 7) struggled with compromised nationwide spend visibility, adding a layer of complexity to its already intricate operations. The bank relied on labor-intensive analytic processes, highlighting the prevalent challenge of information accessibility. Premier Financial Services Company (Case 8), categorized as a premier financial institution, faced hurdles such as disparate buying processes and non-compliance with global policies. These foundational challenges underscore the importance of addressing basic complexities to establish a robust foundation for procurement processes in diverse organizational settings.

Level 2 Challenges - Moderate Complexity:

Moving beyond the fundamental complexities, organizations at Level 2 faced challenges of moderate intricacy, demanding a nuanced approach to procurement enhancement. In the case of the Leading Airline (Case 2), exceptionally high unmanaged spend posed a considerable challenge, requiring strategic interventions. The lack of visibility across categories and the prevalence of ad-hoc, off-contract spending for low-value transactions added to the organizational intricacy. Similarly, the US-Based Telecom Company (Case 5) encountered moderate complexities, including the need for end-to-end process visibility and the integration of procurement technology with existing legacy systems. The classification of large volumes of data heightened the intricacy of their procurement landscape. Global Hotel and Leisure Company (Case 9) faced challenges stemming from a highly fragmented procurement process, demanding a more centralized and coordinated approach. Manual processes further contributed to the complexity, necessitating an advanced technological solution. Public Services Company in APAC (Case 10) confronted challenges associated with disconnected administrative functions and a lack of alignment with global procurement governance practices. These challenges required a strategic shift towards a more integrated and globally aligned procurement model.

Level 3 Challenges - High Complexity:

At the highest tier of challenges, organizations encountered complexities demanding sophisticated strategies and transformative changes. The Financial Services Firm (Case 4) grappled with a traditional procurement function and a sub-optimal Supplier Relationship Management (SRM) framework. The demand for a flexible, cost-effective, and responsive purchasing paradigm heightened the complexity, necessitating a comprehensive

overhaul of procurement processes. The Premier Financial Services Company (Case 8), in its extended challenges, faced integration issues with an existing Oracle ERP system. Inefficient sourcing communication, reporting deficiencies, and poor data quality added layers of intricacy, calling for advanced technological solutions and process optimizations. The Public Services Company in APAC (Case 10), with its extended challenges, encountered complexities arising from the use of different tools for various procurement processes, ineffective supplier management, and a lack of clear savings tracking. Addressing these challenges required not only strategic technological implementations but also organizational realignment and a comprehensive rethinking of procurement strategies. In conclusion, these high-complexity challenges underscore the need for holistic and transformative approaches to ensure procurement excellence in organizations.



Figure 2 Pyramid Reflecting the three levels of challenges

Top (High Complexity): Represents the number of challenges with the highest level of complexity. Middle (Moderate Complexity): Represents the number of challenges with a moderate level of complexity. Bottom (Basic Complexity): Represents the number of challenges with the basic level of complexity.

RQ-1 Fundamental Challenges in Procurement:

What are the common fundamental challenges faced by organizations in their procurement processes, and how do these challenges impact overall efficiency and cost-effectiveness?

Fundamental Challenges in Procurement: The fundamental challenges faced by organizations in their procurement processes, as evidenced by the analysis of the ten cases, encompass issues at the basic level of complexity (Level 1). These challenges have a profound impact on overall efficiency and cost-effectiveness. For instance, the Full-Service Public Utility Company (Case 1) grappled with a lack of visibility into cost drivers for utility-scale transformers, hindering supplier negotiations and spend management. Similarly, the Global Entertainment Company (Case 3) faced the challenge of managing three ERP systems, leading to little visibility into spend and necessitating a technology solution. The HUD's Real Estate Assessment Center (Case 6) encountered basic challenges in obtaining pricing for property inspections, resulting in a time-consuming traditional procurement process. The Major U.S. Bank (Case 7) faced compromised nationwide spend visibility, relying on labor-intensive analytic processes. Premier Financial Services Company (Case 8) dealt with disparate buying processes and non-compliance to global policies.

These fundamental challenges impact efficiency by impeding supplier negotiations, increasing analytic processes' time intensity, and limiting visibility into procurement operations. In addressing these challenges, organizations implemented tailored interventions, such as deploying new technology solutions, streamlining procurement

processes, and enhancing spend visibility. The results demonstrated improvements in cost transparency, streamlined procurement workflows, and increased compliance. This highlights the critical importance of addressing these fundamental challenges strategically to enhance overall procurement efficiency and achieve sustained cost-effectiveness.

RQ2 Strategies for Overcoming Procurement Complexity:

How do organizations effectively address and overcome complex challenges in procurement, such as integration issues, lack of visibility, and disparate buying processes, to enhance strategic sourcing, cost savings, and risk management?

Strategies for Overcoming Procurement Complexity: Organizations, when confronted with complex challenges in procurement, have implemented strategic interventions to enhance strategic sourcing, achieve cost savings, and strengthen risk management. Across the ten cases analyzed, several common strategies emerged. In addressing integration issues, exemplified by the Financial Services Firm (Case 4) facing traditional procurement processes and sub-optimal Supplier Relationship Management (SRM), organizations leveraged advanced procurement platforms. For instance, AI-powered, unified procurement software platform was deployed in multiple cases, such as the Full-Service Public Utility Company (Case 1), Global Entertainment Company (Case 3), Major U.S. Bank (Case 7), Premier Financial Services Company (Case 8), and the Public Services Company in APAC (Case 10). This unified platform streamlined source-to-pay processes, enhanced visibility, and facilitated strategic sourcing. The challenge of lack of visibility, demonstrated by cases like the Global Entertainment Company (Case 3) managing three ERP systems, was systematically addressed through technology implementations. The Global Entertainment Company in this context, used AI driven spend analysis tools, data refresh cycles, and a spend visibility dashboard. This resulted in remarkable efficiencies, achieving a spend analysis accuracy rate of more than 90% across multiple source systems.

Disparate buying processes, a prevalent challenge highlighted by the Premier Financial Services Company (Case 8), saw organizations standardizing and consolidating procurement operations. The company used end-to-end AI driven P2P system that played a pivotal role in achieving this standardization by configuring approvals, tax requirements, and reporting needs. Additionally, the platform's deployment across multiple business units facilitated a centralized approach to procurement, enforcing compliance with global policies.

Overall, organizations successfully addressed complex procurement challenges by embracing innovative technologies, implementing unified platforms, and standardizing processes. These strategic interventions not only enhanced procurement efficiency and effectiveness but also contributed significantly to strategic sourcing, cost savings, and risk management objectives.

RQ3 Impact of Technology in Procurement Transformations:

To what extent do organizations leverage technological solutions, such as unified procurement platforms, AI-driven analytics, and automation tools, in transforming their procurement functions, and what measurable impacts do these technological interventions have on efficiency and savings?

Impact of Technology in Procurement Transformations: Organizations, in their pursuit of transforming procurement functions, have extensively leveraged technological solutions, demonstrating a significant shift towards unified procurement platforms, AI-driven analytics, and automation tools. Across the ten cases analyzed, a consistent pattern emerged, showcasing the widespread adoption of advanced technologies to enhance efficiency and drive savings.

Unified procurement platforms played a central role in several transformations. Cases like the Full-Service Public Utility Company (Case 1), Global Entertainment Company (Case 3), Major U.S. Bank (Case 7), Premier Financial Services Company (Case 8), and the Public Services Company in APAC (Case 10) all implemented AI driven unified procurement tool to streamline source-to-pay processes, achieve spend visibility, and enforce compliance. The measurable impacts were substantial, including increased cost transparency, fact-based negotiations, and formalized price mechanisms, ultimately leading to enhanced bargaining power.

AI-driven analytics emerged as a crucial component, particularly in addressing challenges related to lack of visibility and spend analysis. The Financial Services Firm (Case 4) effectively utilized AI-driven spend analytics to identify key high-spend categories, leading to an almost eight-fold increase in annualized savings from \$1.9 million to \$14 million. Similarly, the Global Entertainment Company (Case 3) achieved a spend analysis accuracy rate of over 90% across three source systems, demonstrating the power of AI in improving data accuracy and insights.

Table 2
Challenges, Interventions and Results for all the three levels
First Level Challenges (Basic Complexity)

Case No	Challenges	Interventions	Results
1	Lack of visibility into cost drivers for utility-scale transformers.	Conducted extensive research to understand production processes and identify cost buckets.	Increased cost transparency and fact- based negotiations with suppliers Identified cost-saving opportunities in sourcing transformers. Formalized price mechanism on high-spend categories, increasing bargaining power.
	Complex operations hindering supplier negotiations and spend management.	Interacted with suppliers to gain visibility into manufacturing, sourcing, and pricing Developed customized should-cost models for cost breakdown and market insights.	Implemented cost insights across 7 divisions, involving 2,300 users. Provided insights on cost impact when dealing with integrated vs. non-integrated suppliers.
3	Three ERP systems with little visibility into spend.	Implemented a global solution within 12 months, opting for a comprehensive platform. Achieved successful vendor name cleansing and parent vendor compression by 13% to enhance data accuracy and streamline procurement processes.	Achieved a spend analysis accuracy rate of more than 90%. Spend visibility increased to 97% of the annual spend. Significant impact on enterprise-wide visibility of spend.
	Need for technology to optimize spend analysis and categorization.	Implemented Spend Analysis tool, monthly data refresh cycles, vendor- parent linkage visibility, and a spend visibility dashboard.	Spend visibility shot up to 97% of the annual spend. Created a substantial impact on the client by helping achieve enterprise-wide visibility of spend.
6	Difficulty in obtaining pricing for property inspections.	Provided a cost-effective, web-based, and intuitive solution with reverse auction capability.	HUD was able to run over 30,000 inspections in three years. Generated savings of 23% on a spend of more than \$16 million. Reduced cycle time for pricing and awarding contracts.
	Time-consuming and labor-intensive traditional procurement process.	- Implemented a five-step approach for gathering requirements, configuring the system, testing, training, and deployment.	Validation of payments through pricing submitted in the reverse auction tool. Enabled HUD to significantly cut down turnaround times and improve service delivery.
7	Compromised nationwide spend visibility.	Established a unified Source-to-Pay (S2P) procurement platform and configured it to provide highly granular visibility of spend to the line-item level	Significant improvements in overall data visibility. Reduced spend analysis turnaround times. Increased spend analysis accuracy to 9%.
	Time-intensive analytic processes.	Enhanced cleansing, validation, enrichment, and classification of data along with enterprise-wide spend reporting capabilities.	Improved identification of savings opportunities. Successful migration from legacy system to AI enabled e procurement system . Enhanced spend reporting capabilities for the client.
	Reliance on general ledger data for spend analysis.	Developed a custom taxonomy for the client, including unchanged Finance categories and a procurement focus for all other categories.	Boost transparency and visibility of nationwide spend Enhanced spend analysis and categorization capabilities. Implementation of a more efficient processing platform.
8	Disparate buying processes across branches.	Implemented a unified procurement platform for end-to-end P2P. The platform was configured to address specific requirements such as	Manages \$650M annual spend on the unified procurement. Enabled visibility throughout procure-to-pay process. Improved data quality for spending

Case No	Challenges	Interventions	Results
		approvals, tax considerations, and reporting needs	analysis. Addressed audit requirements through improved reporting.
	Limited visibility into procurement operations.	Rolled out requisitioning, purchasing, accounts payable functions across all locations.	Integrated 15+ catalogs and 1000+ SKUs Enforced compliance with global A&A policy. Improved sourcing communication and information retention.
	Lack of robust P2P technology.	Established centralized strategies with a distributed procurement model Automated various manual processes for efficiency.	Onboarded suppliers and integrated catalogs onto the model. Streamlined end-to-end procurement workflows. Delivered complete visibility into source- to-buy operations.
	Non-compliance to global policies.	Enabled enterprise-wide visibility into procurement data and processes.	Transformed procurement from a fragmented function to centralized strategic capability. Achieved high user adoption across the organization due to ease of use.

Case No	Challenges	Interventions	Results
2	Exceptionally high unmanaged spend.	Implemented a leading procurement technology solution for Source-to-Pay (S2P) processes .	Achieved a 30% reduction in unmanaged spend. Established a Procurement Centre Of Excellence for continuous improvement.
	Lack of visibility across categories.	Utilized a comprehensive spend analysis tool for comprehensive visibility.	Improved spend visibility across diverse categories. Enabled informed decision-making through enhanced insights.
	Ad-hoc, off-contract spend for low-value transactions.	Implemented robust contract management	Reduced off-contract spend through effective contract management. Enhanced control over low-value transactions.
5	Need for end-to-end process visibility.	Deployed a unified procurement platform and conducted extensive training for seamless adoption.	Achieved end-to-end visibility of the procurement process. Improved compliance through system-driven processes.
	Integration of procurement technology with legacy systems.	Integrated a modern procurement system with existing legacy systems, implementing customized integration solutions to ensure seamless data flow.	Ensured smooth integration of new technology with existing systems. Enhanced overall efficiency and data accuracy.
	Classification of large volumes of data.	Implemented AI-driven analytics for automated data classification.	Achieved accurate classification of large data volumes. Reduced manual effort in data categorization.
9	Highly fragmented procurement process.	Implemented a unified procurement solution.	Streamlined and consolidated the procurement process. Improved overall procurement efficiency and effectiveness.
	Lack of visibility and coordination.	Deployed a unified procurement platform to enhance visibility and coordination across procurement activities.	Achieved better visibility and coordination in procurement operations. Improved communication and collaboration.

Second Level Challenges (Moderate Complexity)

Case No	Challenges	Interventions	Results
	Manual processes.	Automated manual processes using automation tools.	Increased operational efficiency through process automation. Reduced errors associated with manual procurement.
10	Disconnected administrative function.	Implemented a centralized administrative function by utilizing a cutting-edge e-procurement platform.	Connected administrative functions for better coordination. Improved efficiency through centralized processes.
	Lack of alignment with global procurement governance practices.	Conducted training programs on global procurement governance practices.	Improved alignment with global procurement standards. Enhanced compliance with governance practices.
	Regional procurement organized on a business-unit level.	Implemented a centralized procurement model by adopting advanced e- procurement solutions for enhanced efficiency and streamlined processes	Transitioned from regional to centralized procurement. Achieved standardization and consistency in procurement.

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Case No	Challenges	Interventions	Results
4	Traditional procurement function.	Undertook a comprehensive review and redesign of the procurement function.	Transformed the procurement function from traditional to strategic. Improved agility and responsiveness in purchasing.
	Sub-optimal SRM framework.	Implemented a robust Supplier Relationship Management (SRM) framework.	Enhanced strategic supplier relationships. Improved supplier performance and collaboration.
	Demand for a flexible, cost-effective, and responsive purchasing paradigm.	Implemented agile procurement processes leveraging advanced e- procurement solutions.	Achieved flexibility and responsiveness in purchasing. Reduced procurement costs through cost-effective practices.
8	Integration challenges with existing Oracle ERP system.	Conducted a phased integration of the advanced e-procurement platform with the existing Oracle ERP system.	Successfully integrated new procurement technology with Oracle ERP. Ensured seamless data flow between systems.
	Inefficient sourcing communication.	Established clear communication protocols and channels for sourcing activities.	Improved communication efficiency in sourcing processes. Reduced delays and miscommunications.
	Reporting deficiencies.	Implemented advanced reporting tools within the AI-driven e- procurement platform for real- time insights.	Addressed reporting deficiencies by enabling real-time data analytics. Enhanced decision-making through data insights.
	Poor data quality.	Conducted data cleansing and validation processes with advanced tools	Improved overall data quality and accuracy. Enabled reliable and data- driven decision-making.
10	Use of different tools for different procurement processes.	Consolidated procurement processes on a unified platform.	Eliminated the use of multiple tools, ensuring process consistency. Enhanced efficiency through a unified approach.
	Ineffective supplier management.	Implemented advanced supplier management modules in a comprehensive procurement software solution.	Improved effectiveness in supplier management Enhanced collaboration and transparency with suppliers.

Third Level Challenges (High Complexity)

Case No	Challenges	Interventions	Results
	Lack of clear savings tracking.	Utilized a comprehensive procurement software's savings tracking features	Achieved clear and transparent tracking of procurement savings Improved visibility into cost-saving initiatives.

Automation tools were instrumental in tackling diverse challenges. The US-Based Telecom Company (Case 5) successfully automated sourcing, supplier management, and contract management processes using AI driven procurement tool leading to a significant increase in managed spend, efficient catalog management, and enhanced visibility across categories and business units. The Public Services Company in APAC (Case 10) deployed unified procurement software tool designed exclusively for it by a global leader in with expertise in developing AI driven supply and procurement software to automate various tasks, driving efficiency through technology versus manual processes and enabling enterprise-wide visibility.

In summary, organizations have not only embraced but heavily relied on technological solutions, ranging from unified platforms to AI-driven analytics and automation tools, to drive transformative changes in their procurement functions. The measurable impacts include increased cost transparency, improved negotiations, substantial savings, and enhanced efficiency across diverse procurement operations.

RQ-4 Achieving Procurement Maturity:

What are the key factors and interventions that contribute to the evolution of procurement functions from basic cost-saving measures to strategic, centralized, and globally aligned operations, ensuring compliance, scalability, and continuous improvement?

Strategic Alignment and Global Integration:

Global Standardization: Organizations, such as the Public Services Company in APAC (Case 10), strategically aligned their APAC procurement with global practices. Implementing global procurement policies, processes, and governance practices ensured a standardized approach, fostering alignment with broader organizational goals.

Unified Procurement Platforms: The adoption of unified procurement platforms, across multiple cases (e.g., Cases 1, 3, 7, 8, and 10), played a pivotal role in centralizing and aligning procurement operations. These platforms facilitated standardized processes, enhanced visibility, and provided a foundation for global integration.

Technology-Driven Transformations:

AI-Driven Analytics: The Financial Services Firm (Case 4) harnessed the power of AI-driven spend analytics to identify high-spend categories, leading to an eight-fold increase in annualized savings. This technology-driven approach contributed to data accuracy, enabling strategic decision-making.

Automation Tools: Automation tools, integrated into platforms like cloud-based technology solution that got integrated with its existing three ERP systems (Cases 5 and 10), played a crucial role in streamlining procurement workflows. From sourcing to supplier management, automation contributed to efficiency, scalability, and reduced manual intervention.

Compliance and Risk Management:

Supplier Risk Framework: Both Premier Financial Services Company (Case 8) and the Public Services Company in APAC (Case 10) implemented robust supplier risk frameworks. These frameworks, configured to AI enabled unified, procurement software platform with end-to-end source-to-pay (S2P) capabilities, facilitated effective management of supplier risks, ensuring compliance and mitigating potential disruptions.

Continuous Improvement Initiatives:

Initiatives for Efficiency: The Public Services Company in APAC (Case 10) launched 20 continuous improvement initiatives. These initiatives focused on driving incremental savings, enhancing efficiency, and fostering a culture of continuous improvement within the procurement function.

Centralization and Standardization:

Center-Led Procurement Models: The Public Services Company in APAC (Case 10) transitioned to a center-led procurement model. This shift, along with the establishment of regional business partners and global category owners, contributed to centralization, standardization, and improved coordination.

Planning and Budget Alignment:

Alignment with Budget Cycles: Aligning procurement planning cycles with finance budget-setting cycles, as demonstrated by the Public Services Company in APAC (Case 10), ensured clear visibility of reported savings. Embedding direct P&L impacting savings into budgets fostered financial integration.

In summary, achieving procurement maturity involves a strategic interplay of factors, including global alignment, technology-driven transformations, robust compliance and risk management, continuous improvement initiatives, and a focus on centralization and standardization. These interventions collectively contribute to the evolution of



procurement functions into strategic, centralized, and globally aligned operations, ensuring compliance, scalability, and a commitment to continuous improvement.

Figure 3

Model showing challenges, interventions and results for all the three levels (prepared by the authors using Whimsical)

Conclusion:

Cutting across the many facets of procurement, the ten disparate cases discussed trace the contours of a transformative journey from elemental challenges to a state of sophistication hallmarked by strategic alignment, technical acumen, and operational eminence. The elemental challenges, ranging from the lack of visibility to disjointed buying processes, serve as the clarion call for strategic interventions. Rectifying the system for strategic results pinpoints the rationale and the means for reimagining operations, yielding a globally aligned organization underpinned by a singular procurement platform armed with AI-driven analytics and automation to stem the tide against complexity and inefficiency. Intensifying the commitment to compliance, risk management, and continuous improvement underscores the pledge not to meet industry standards but to leapfrog them.

The cases make visible the transformational power of technology with singular procurement platforms as the lynchpin for centralization, standardization, and shared visibility. The infusion of AI-driven analytics and automation stands out as the lifeblood of a procurement that sprints past the realm of greater efficiency for that of greater cost-effectiveness. The confluence of technology and strategic imperatives is further underscored by the keen attention dedicated to compliance, risk mitigation, and continuous improvement, driving home the message that procurement maturity demands continual agility and invention. In all, these transitions marked a gradual metamorphosis — from procurement as a cost-saving function to a strategic, globally aligned, centralized

operation marked by world-class standards, advanced technology, and an unwavering commitment to continuous improvement. The blueprint for organizations hoping to achieve this fully mature procurement state is a common one, built on strategic alignment, technological interventions, adherence to compliance, and a relentless pursuit of betterment.

For the procurement landscape, these insights add yet another chapter to its complete evolution story. It is a narrative starting with pure cost-savings, regulatory compliance, and supplier performance initiatives turned into operational efficiency and an improvement in the procurement pro's overall skill set. Now, it's about not only operational efficiency but organizations that align with corporate and work-stream strategies and continue to improve upon these efficient operations within all the guidelines of corporate policies and global standards.

In no case is the journey over. Each successful challenge will beget another until there is strategic innovation that helps guide procurement up as well as forward since all challenges met with its strategic interventions will lead to the modeled efficiency, cost, and success an organization can have.

Future Research:

In short, a multifaceted approach is needed for future research in procurement. This approach would deepen understanding and shape the evolving landscape in a number of ways. First, through deep case studies that provide more granular insights into specific challenges, interventions, and outcomes in individual organizations. Second, through longitudinal studies that chart the evolution of procurement over time and provide a fuller understanding of the lasting impact of interventions and the ongoing learnings and adaptations they make possible. Third, through comparative analyses that unveil sector-specific challenges and best practices. Fourth through the human elements of change and the perspectives of employees and stakeholders involved in the transformations of procurement. Fifth, through the emerging technologies and their evolving capabilities, such as blockchain, machine learning, predictive analytics, and procurement. Sixth, through understanding how organizations are globalizing and harmonizing procurement practices across a cacophony of different markets and regulatory environments. Seventh, the inclusion of sustainable practices as a seamless part of procurement processes. Eighth, how organizations are building risk management strategies that are robust enough for the volatile times in which they find themselves. Ninth, the quantitative analyses of the impact of these interventions on key performance indicators and efficiency metrics. And finally, the collaborative research of academics and their practitioner and technology provider counterparts that help to build out a holistic picture of the procurement dynamics, needs, and challenges — the result of which could be frameworks, best practices, and innovative solutions that become the foundation of shared and continued exploration.

References:

- [1] Afolabi, A., Ibem, E., Aduwo, E., Tunji-Olayeni, P., & Oluwunmi, O. (2019). Critical success factors (CSFs) for e-Procurement adoption in the Nigerian construction industry. *Buildings*, *9*(2), 47.
- [2] Afolabi, O. J., Salau, A. M. A., & Oke, O. L. (1984). Quality changes of nigerian traditionally processed freshwater fish species.. International Journal of Food Science & Amp; Technology, 19(3), 341-348. <u>https://doi.org/10.1111/j.1365-2621.1984.tb00357.x</u>
- [3] Aman, A., & Kasimin, H. (2011). E-Government Evaluation and Organizational Learning. *International Journal of Digital Society*, 2.
- [4] Barajei, C., Kheni, N. A., Appiah-Kubi, E., Danso, H., & Iddrisu, A. W. (2023). Enhancing the success of Ghanaian public road construction projects. *Cogent Engineering*, *10*(1), 2199514.
- [5] Bhullar, P. S., & Gupta, P. K. (2017). Empirical analysis of determinants of profitability of banks: evidence from Indian public sector banks. *international journal of accounting and financial reporting*, 7(2), 404-416.
- [6] Bloom, N., Sadun, R., & Van Reenen, J. (2012). The organization of firms across countries. The Quarterly Journal of Economics, 127(4), 1663-1705.
- [7] Bouncken, R. B., Fredrich, V., & Gudergan, S. (2022). Alliance management and innovation under uncertainty. *Journal of Management & Organization*, 28(3), 540-563.
- [8] Rangaraju, S. (2023, December 1). AI Sentry: Reinventing Cybersecurity Through Intelligent Threat Detection. *Eph* International Journal of Science and Engineering, 9(3), 30–35. <u>https://doi.org/10.53555/ephijse.v9i3.211</u>.
- [9] Croom, S., & Brandon-Jones, A. (2007). Impact of e-procurement: experiences from implementation in the UK public sector. *Journal of Purchasing and Supply management*, *13*(4), 294-303.
- [10] Dubois, A., & Pedersen, A. C. (2002). Why relationships do not fit into purchasing portfolio models—a comparison between the portfolio and industrial network approaches. European Journal of Purchasing & Supply Management, 8(1), 35-42.

- [11] Ellram, L. M., & Carr, A. (1994). Strategic purchasing: A history and review of the literature. International Journal of Purchasing and Materials Management, 30(2), 10-18.
- [12] Fernandes, T., & Vieira, V. (2015). Public e-procurement impacts in small-and medium enterprises. International Journal of Procurement Management, 8(5), 587-607.
- [13] Gadde, L. E., & Håkansson, H. (1993). Professional purchasing. London: Routledge.
- [14] Gardenal, F. (2013). A model to measure e-procurement impacts on organizational performance. *Journal of public procurement*, 13(2), 215-242.
- [15] Hardinata, D., & Kamaludin, K. (2022). HOW TO MINIMIZE RISK: THE IMPLEMENTATION OF PUBLIC SECTOR SERVICES ELECTRONIC PROCUREMENT IN INDONESIA. Jurnal Ilmiah Ekonomi Bisnis, 27(3), 289-302.
- [16] Hawkins, T. G., & Gravier, M. J. (2016). Electronic Reverse Auctions: Spawning Procurement Innovation in the Context of Arab Culture. *The MENA Journal of Business Case Studies*.
- [17] Ibem, E. O., Aduwo, E. B., Uwakonye, U. O., Tunji-Olayeni, P. ., & Ayo-Vaughan, E. A. (2018). Survey data on e-procurement adoption in the nigerian building industry. Data in Brief, 18, 823-826. <u>https://doi.org/10.1016/j.dib.2018.03.089</u>
- [18] Khorana, S., Ferguson-Boucher, K., & Kerr, W. A. (2015). Governance Issues in the EU's e-Procurement Framework. *JCMS: Journal of Common Market Studies*, 53(2), 292-310.
- [19] Kraljic, P. (1983). Purchasing must become supply management. Harvard Business Review, 61(5), 109-117.
- [20] Kumar, V., & Reinartz, W. (2018). Customer relationship management. Springer-Verlag GmbH Germany, part of Springer Nature 2006, 2012, 2018.
- [21] Lange, A. G. d., Barth, C., Kaufmann, T., Anatürk, M., Suri, S., Ebmeier, K. P., ... & Westlye, L. T. (2020). History of childbirths relates to region-specific brain aging patterns in middle and older-aged women. <u>https://doi.org/10.1101/2020.05.08.084616</u>
- [22] Liu, S., Wang, X., Liu, M., & Zhu, J. (2017). Towards better analysis of machine learning models: A visual analytics perspective. *Visual Informatics*, 1(1), 48-56.
- [23] Madanaguli, A., Parida, V., Sjödin, D., & Oghazi, P. (2023). Literature review on industrial digital platforms: A business model perspective and suggestions for future research. *Technological Forecasting and Social Change*, 194, 122606.
- [24] Madanaguli, A., Sjödin, D., Parida, V., & Mikalef, P. (2024). Artificial intelligence capabilities for circular business models: Research synthesis and future agenda. Technological Forecasting and Social Change, 200, 123189.
- [25] Maseleno, A., Hashim, W., Alicia, Y. C., Moamin, A. M., & Othman, M. (2020). A Review on Smart Grid Internet of Things. *Journal of Computational and Theoretical Nanoscience*, 17(6), 2770-2775.
- [26] Mavani, N. R., Ali, J. M., Othman, S., Hussain, M. A., Hashim, H., & Rahman, N. A. (2022). Application of artificial intelligence in food industry—a guideline. *Food Engineering Reviews*, 14(1), 134-175.
- [27] McBride, K., van Noordt, C., Misuraca, G., & Hammerschmid, G. (2021). Towards a systematic understanding on the challenges of procuring artificial intelligence in the public sector.
- [28] Modgil, S., Gupta, S., Stekelorum, R., & Laguir, I. (2021). AI technologies and their impact on supply chain resilience during COVID-19. *International Journal of Physical Distribution & Logistics Management*, 52(2), 130-149.
- [29] Modgil, S., Singh, R. K., & Hannibal, C. (2022). Artificial intelligence for supply chain resilience: learning from Covid-19. The International Journal of Logistics Management, 33(4), 1246-1268.
- [30] Mohamed Hashim, M. A., Tlemsani, I., & Matthews, R. (2022). Higher education strategy in digital transformation. *Education and Information Technologies*, 27(3), 3171-3195.
- [31] Mohungoo, I., Brown, I., & Kabanda, S. (2020). A systematic review of implementation challenges in public E-Procurement. In Responsible Design, Implementation and Use of Information and Communication Technology: 19th IFIP WG 6.11 Conference on e-Business, e-Services, and e-Society, I3E 2020, Skukuza, South Africa, April 6–8, 2020, Proceedings, Part II 19 (pp. 46-58). Springer International Publishing.
- [32] Mossberg, J., Söderholm, P., & Frishammar, J. (2021). Challenges of sustainable industrial transformation: S wedish biorefinery development and incumbents in the emerging biofuels industry. *Biofuels, Bioproducts and Biorefining*, 15(5), 1264-1280.
- [33] Ning, H., Wang, H., Lin, Y., Wang, W., Dhelim, S., Farha, F., ... & Daneshmand, M. (2023). A Survey on the Metaverse: The State-of-the-Art, Technologies, Applications, and Challenges. *IEEE Internet of Things Journal*.
- [34] Ofori, D., & Fuseini, O. I. (2020). Electronic Government Procurement Adoption in Ghana: Critical Success Factors. Advances in Research, 21(3), 18–34. <u>https://doi.org/10.9734/air/2020/v21i330191</u>

- [35] Patel, H. (2023). The transformative role of artificial intelligence in modern agriculture. Rev. Artif. Intell. Educ, 4(00), e014. <u>https://doi.org/10.37497/rev.artif.intell.educ.v4i00.14</u>
- [36] Podmetina, D., Soderquist, K. E., Petraite, M., & Teplov, R. (2018). Developing a competency model for open innovation: From the individual to the organisational level. *Management Decision*, 56(6), 1306-1335.
- [37] Porter, M. E. (1985). Competitive advantage: Creating and sustaining superior performance. New York: Free Press.
- [38] Pouikli, K. (2021, January). Towards mandatory Green Public Procurement (GPP) requirements under the EU Green Deal: reconsidering the role of public procurement as an environmental policy tool. In *ERA Forum* (Vol. 21, No. 4, pp. 699-721). Berlin/Heidelberg: Springer Berlin Heidelberg.
- [39] Prasad, B., & Junni, P. (2016). CEO transformational and transactional leadership and organizational innovation: The moderating role of environmental dynamism. *Management Decision*, *54*(7), 1542-1568.
- [40] Ramdani, B., Kawalek, P., & Lorenzo, O. (2009). Predicting SMEs' adoption of enterprise systems. Journal of enterprise information management, 22(1/2), 10-24.
- [41] Riauan, M. A. I., Sitanggang, Y., & Ahmad, Z. A. (2022). Communication Activities on the Implementation of E-procurement in Indragiri Hulu Regency. *Journal of Applied Engineering and Technological Science* (*JAETS*), 4(1), 469-477.
- [42] Saber, Z., Bahraami, H. R., & Haery, F. A. (2014). Analysis of the impact of supply chain management techniques: A competitive advantage in the market. *International Journal of Academic Research in Economics and Management Sciences*, 3(1), 75.
- [43] Salifu, Z., Nangpiire, C., Dawdi, A., & Yussif, F. (2022). Assessing the extent of electronic procurement adoption challenges in the public sector of ghana.. <u>https://doi.org/10.21203/rs.3.rs-2356116/v1</u>
- [44] Sánchez-Rodríguez, C., Martínez-Lorente, A. R., & Hemsworth, D. (2019). E-procurement in small and medium sized enterprises; facilitators, obstacles, and effect on performance. *Benchmarking: An International Journal*, 27(2), 839-866.
- [45] Sjödin, D., Parida, V., & Kohtamäki, M. (2023). Artificial intelligence enabling circular business model innovation in digital servitization: Conceptualizing dynamic capabilities, AI capacities, business models and effects. *Technological Forecasting and Social Change*, 197, 122903.
- [46] Smith, A. D. (2009). The impact of e-procurement systems on customer relationship management: a multiple case study. International Journal of Procurement Management, 2(3), 314-338.
- [47] Tseng, M. L., Bui, T. D., Lim, M. K., Fujii, M., & Mishra, U. (2022). Assessing data-driven sustainable supply chain management indicators for the textile industry under industrial disruption and ambidexterity. *International Journal of Production Economics*, 245, 108401.
- [48] Van Weele, A. (2005). Purchasing & supply chain management: Analysis, strategy, planning and practice. London: Thomson Learning.
- [49] Yusni, Y. (2022). Pengaruh Implementasi E-Procurement dan Komitmen Organisasi Terhadap Pencegahan Fraud Pengadaan Barang/Jasa Dengan Sistem Pengendalian Internal Pemerintah Sebagai Variabel Moderasi. INOBIS: Jurnal Inovasi Bisnis Dan Manajemen Indonesia, 5(2), 138-148.
- [50] Zhao, L., & Strotmann, A. (2021). Artificial intelligence in e-procurement: Opportunities and challenges. Journal of Procurement Management, 34(2), 145-157.