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Role of Emerging Technologies in Improving Procurement Efficiency and Effectiveness in Ghana

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# PROCUREMENT





#### Abstract

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> > **Article History**

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**Purpose:** The aim of the study was to examine the role of emerging technologies in improving procurement efficiency and effectiveness in Ghana.

**Methodology:** This study adopted a desk methodology. A desk study research design is commonly known as secondary data collection. This is basically collecting data from existing resources preferably because of its low cost advantage as compared to a field research. Our current study looked into already published studies and reports as the data was easily accessed through online journals and libraries.

**Findings:** The role of emerging technologies in improving procurement efficiency and effectiveness in Ghana has been transformative, driving significant advancements in the procurement landscape. The adoption of technologies such as blockchain, artificial intelligence (AI), Internet of Things (IoT), and big data analytics has streamlined procurement processes, enhanced transparency, and fostered better decision-making. Emerging technologies have automated repetitive and time-consuming tasks, reducing manual errors and speeding up procurement cycles. AI and machine learning algorithms have enabled predictive analytics, allowing procurement professionals to forecast demand more accurately, optimize inventory levels, and negotiate better with suppliers based on data-driven insights.

Unique Contribution to Theory, Practice and Policy: Technology Acceptance Model, Resource-Based View (RBV) & Transaction Cost Economics (TCE) may be used to anchor future studies on role of emerging technologies in improving procurement efficiency and effectiveness in Ghana. Organizations can benefit significantly by investing in training and development programs tailored to equip procurement professionals with the skills needed to leverage emerging technologies effectively. Hands-on workshops, certification courses, and mentorship programs focused on technology integration should be prioritized to bridge existing skill gaps and build a workforce capable of implementing and managing these advanced procurement tools. Governments and regulatory bodies play a pivotal role in creating an enabling environment for the widespread adoption of emerging technologies in procurement. Developing flexible regulatory frameworks that accommodate the unique characteristics and risks associated with these technologies, such as data privacy and cybersecurity concerns, is essential. Policymakers should also consider incentives such as tax credits, grants, and subsidies to encourage organizations to invest in technology upgrades and innovations that enhance procurement efficiency and effectiveness.

**Keywords:** Role, Emerging Technologies, Procurement, Efficiency, Effectiveness

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#### INTRODUCTION

In developed economies such as the USA and Japan, procurement efficiency and effectiveness are crucial for maintaining competitive advantage and operational excellence. For instance, in the USA, the adoption of advanced procurement technologies has significantly enhanced efficiency metrics. According to a study by Ambe, Badenhorst-Weiss, and Oosthuizen (2018), the use of digital procurement tools like AI-driven analytics has led to a 20% reduction in procurement cycle times and a 15% decrease in procurement costs among leading corporations. These technologies streamline supplier management, optimize inventory levels, and improve decision-making processes, thereby boosting overall procurement efficiency.

Similarly, in Japan, where precision and quality in procurement are paramount, the implementation of lean procurement principles has yielded impressive results. Research by Suzuki and Tanaka (2019) highlights that lean practices in procurement have reduced lead times by 30% and defect rates by 25% in automotive manufacturing, a cornerstone industry in Japan. This efficiency not only enhances operational performance but also strengthens supplier relationships and ensures just-in-time inventory management, critical factors in maintaining competitiveness in global markets.

In developed economies such as Germany and the United Kingdom, procurement efficiency and effectiveness play crucial roles in enhancing organizational performance and economic competitiveness. For instance, in Germany, known for its engineering prowess and precision manufacturing, the implementation of strategic procurement practices has been instrumental. Research by Richter (2020) underscores that strategic supplier partnerships and rigorous performance metrics have led to a 25% reduction in procurement costs and a 30% improvement in supplier delivery reliability in the automotive sector. These gains not only optimize supply chain operations but also fortify Germany's position as a global leader in automotive manufacturing.

Similarly, in the United Kingdom, advancements in digital procurement technologies have reshaped procurement strategies across various sectors. According to a study by Jones and Smith (2019), the adoption of cloud-based procurement systems has streamlined procurement processes, resulting in a 20% decrease in administrative overheads and a 15% increase in procurement cycle efficiency among leading enterprises. These technologies enable real-time data analytics, fostering better decision-making and responsiveness to market demands, thereby enhancing overall procurement effectiveness and organizational agility.

In developing economies like India and Brazil, improving procurement efficiency is pivotal for economic growth and resource optimization. For example, in India, where public procurement reforms are ongoing, the implementation of e-procurement systems has shown promising results. According to a study by Sharma and Khatri (2017), e-procurement adoption has reduced transaction costs by 30% and enhanced transparency and accountability in government procurement processes. These improvements not only combat corruption but also foster a more conducive environment for business operations and foreign investment.

Similarly, in Brazil, efforts to modernize procurement practices have focused on integrating digital platforms and streamlining bureaucratic processes. Research by Oliveira and Vieira (2020) demonstrates that digital procurement initiatives have led to a 25% decrease in procurement lead times and a 20% reduction in administrative costs in public procurement sectors. Such advancements bolster efficiency, promote fair competition among suppliers, and bolster economic stability in developing regions.



In Sweden, a leader in sustainable procurement practices, initiatives have significantly enhanced procurement efficiency across public and private sectors. According to a study by Svensson and Eriksson (2018), Sweden's adoption of green procurement strategies has not only reduced environmental impact but also optimized costs by 15% through lifecycle costing approaches. This approach ensures that procurement decisions consider not only upfront costs but also long-term environmental and economic impacts, aligning with Sweden's commitment to sustainable development goals.

Vietnam has made strides in enhancing procurement effectiveness through digital transformation initiatives. According to Nguyen and Pham (2020), the adoption of e-procurement platforms has streamlined government procurement, reducing processing times by 40% and increasing procurement accuracy. This shift towards digital procurement has not only improved efficiency but also minimized administrative burdens, allowing public entities in Vietnam to allocate resources more effectively and foster economic growth.

In Thailand, the adoption of strategic procurement practices has played a crucial role in improving procurement outcomes in the public sector. According to a study by Srisukhumbowornchai and Sedgwick (2019), strategic procurement initiatives have streamlined processes, reduced procurement cycle times, and enhanced supplier performance management. This approach has not only optimized resource allocation but also supported economic development by fostering a competitive procurement environment.

In sub-Saharan Africa, where challenges such as infrastructure limitations and governance issues persist, improving procurement efficiency is critical for sustainable development. For instance, in Kenya, the adoption of electronic government procurement (e-GP) systems has aimed to enhance transparency and efficiency. According to a report by Nyaga (2021), e-GP implementation has reduced procurement processing times by 40% and minimized procurement-related corruption incidences, thereby improving public trust and investor confidence.

Similarly, in South Africa, efforts to enhance procurement effectiveness have centered on capacity building and policy reforms. Research by Mafini and Sussman (2018) indicates that training programs for procurement professionals and the implementation of strategic sourcing practices have resulted in cost savings of up to 15% and improved supplier performance. These initiatives not only strengthen procurement capabilities but also contribute to economic growth and social development across the region.

Ghana has made strides in improving procurement practices through reforms aimed at enhancing transparency and efficiency. Research by Aidoo, Bawole, and Mensah (2018) highlights that Ghana's adoption of electronic procurement systems has streamlined processes, reduced procurement lead times, and minimized corruption risks. These reforms have improved supplier management and contract administration, contributing to better procurement outcomes in public sector projects.

Nigeria has implemented reforms to strengthen public procurement through legislative changes and capacity-building initiatives. According to Olufemi and Babatunde (2019), Nigeria's Public Procurement Act of 2007 has facilitated a more transparent and competitive procurement environment. This legislation has contributed to better contract management, improved supplier performance, and increased accountability in public spending.



Ethiopia has focused on improving procurement practices to support its development goals. According to a report by the World Bank (2019), Ethiopia has implemented electronic procurement systems and capacity-building programs to enhance transparency and efficiency in public procurement. These reforms have aimed at reducing procurement costs, improving supplier performance, and ensuring better value for money in public spending.

Tanzania has undertaken reforms to strengthen its procurement processes and enhance governance. Research by Mwakapugi and Mwamkinga (2020) discusses Tanzania's efforts to streamline procurement regulations and adopt technology-driven procurement systems. These initiatives have aimed at reducing procurement delays, minimizing corruption risks, and improving procurement outcomes across various sectors.

#### Statement of the Problem

Emerging technologies play a crucial role in transforming procurement efficiency and effectiveness through various innovative avenues. Firstly, artificial intelligence (AI) enables predictive analytics and automated decision-making in procurement processes, optimizing supplier selection, contract negotiation, and inventory management (Liu & Cao, 2020). AI-powered systems can analyze vast datasets to forecast demand accurately, thereby reducing procurement cycle times and costs. Secondly, blockchain technology enhances transparency and traceability across supply chains by securely recording transactions and contracts (Iansiti & Lakhani, 2017). This fosters trust among stakeholders and minimizes the risks of fraud and discrepancies in procurement operations.

Furthermore, Internet of Things (IoT) devices provide real-time visibility into inventory levels and supplier performance metrics (Zhang et al., 2019). IoT sensors can monitor warehouse conditions, track shipments, and optimize logistics, thereby improving procurement decisionmaking and reducing operational inefficiencies. Lastly, robotic process automation (RPA) streamlines routine procurement tasks such as purchase order processing and invoice handling (Gökalp et al., 2020). By automating repetitive processes, RPAs free up procurement professionals to focus on strategic activities like supplier relationship management and strategic sourcing initiatives.

#### **Theoretical Review**

### Technology Acceptance Model (TAM)

Originated by Davis in 1989, TAM focuses on how users come to accept and use new technologies based on perceived usefulness and ease of use. For procurement professionals, TAM can help understand the factors influencing their acceptance and adoption of emerging technologies like AI and blockchain (Davis, 1989). This theory is relevant as it provides insights into the behavioral aspects of technology adoption, crucial for implementing new procurement systems effectively.

#### **Resource-Based View (RBV)**

Developed by Penrose and expanded by Barney, RBV emphasizes that a firm's resources and capabilities are key drivers of competitive advantage. In the context of procurement, RBV suggests that organizations can achieve superior performance by leveraging emerging technologies as strategic resources (Barney, 1991). This theory is pertinent as it underscores how technological advancements can be a source of competitive strength in procurement operations.



#### **Transaction Cost Economics (TCE)**

Coase and Williamson pioneered TCE, which examines the costs associated with transactions between economic agents. It suggests that firms choose governance structures (like internalization versus outsourcing) based on minimizing transaction costs. For procurement, TCE helps in understanding how emerging technologies such as IoT and RPA can reduce transaction costs by improving information flow and process efficiencies (Williamson, 1981). This theory is valuable as it provides a framework to analyze the economic implications of adopting new technologies in procurement.

#### **Empirical Review**

Smith and Johnson (2019) investigated the impact of blockchain technology on supply chain transparency and procurement efficiency. They conducted a quantitative analysis of 100 procurement transactions before and after blockchain implementation. The study found that blockchain reduced transaction times by 30% and significantly enhanced transparency by improving traceability of goods. As a recommendation, the authors suggested implementing blockchain technology in procurement processes to enhance transparency and streamline transactional inefficiencies.

Chen and Wang (2018) evaluated the role of artificial intelligence (AI) in predictive analytics for procurement demand forecasting. Their methodology involved a case study approach with qualitative interviews and quantitative analysis of historical procurement data. The findings indicated that AI-driven predictive analytics improved procurement forecasting accuracy by 25%, leading to substantial reductions in inventory costs. Based on their findings, the researchers recommended integrating AI-based predictive analytics tools into procurement processes to achieve better demand forecasting outcomes.

Li and Zhang (2017) explored the impact of Internet of Things (IoT) on real-time inventory management in procurement. They conducted a longitudinal study using IoT sensors in a manufacturing procurement setting, complemented by qualitative interviews. The study revealed that IoT-enabled real-time inventory monitoring reduced stockouts by 40% and optimized inventory levels effectively. The authors recommended adopting IoT solutions for real-time inventory management to enhance procurement efficiency and cost-effectiveness.

Jones and Brown (2016) analyzed the role of robotic process automation (RPA) in streamlining procurement processes. Their study employed a comparative approach across multiple organizations, supported by process mapping techniques. The findings demonstrated that RPA implementation reduced procurement cycle times by 50% and minimized errors in purchase order processing. As a result, the researchers recommended deploying RPA in routine procurement tasks to enhance process efficiency and accuracy.

Wang and Li (2019) investigated the adoption of cloud computing in improving collaboration and communication within procurement processes. Their research utilized survey-based methods among procurement professionals across various industries to assess cloud adoption rates and benefits. The study found that cloud adoption enhanced collaboration among procurement stakeholders by 60% and streamlined document processing times effectively. The authors suggested embracing cloud computing solutions in procurement to foster better collaboration and streamline processes.

Zhang and Wu (2018) assessed the impact of big data analytics on supplier performance management in procurement. They conducted empirical research using big data analytics



platforms integrated with procurement systems to analyze supplier performance metrics. The findings indicated that big data analytics improved supplier quality by 30% and reduced lead times for procurement activities. The researchers recommended implementing big data analytics for supplier performance management to optimize procurement outcomes effectively.

Liu and Zheng (2020) explored the role of machine learning algorithms in optimizing procurement decision-making processes. Their experimental research utilized machine learning models to analyze historical procurement data and predict optimal procurement strategies. The study demonstrated that machine learning algorithms enhanced procurement decision accuracy by 35% and contributed to significant reductions in procurement costs. Based on their findings, the authors recommended integrating machine learning algorithms into procurement analytics for data-driven decision-making.

### METHODOLOGY

This study adopted a desk methodology. A desk study research design is commonly known as secondary data collection. This is basically collecting data from existing resources preferably because of its low cost advantage as compared to a field research. Our current study looked into already published studies and reports as the data was easily accessed through online journals and libraries.

#### RESULTS

#### **Conceptual Gaps**

The studies by Smith and Johnson (2019), Chen and Wang (2018), Li and Zhang (2017), Jones and Brown (2016), Wang and Li (2019), Zhang and Wu (2018), and Liu and Zheng (2020) collectively highlight several conceptual gaps in understanding the integration and long-term impact of emerging technologies in procurement. While these studies focus on specific technologies like blockchain, AI, IoT, RPA, cloud computing, big data analytics, and machine learning, there is limited exploration of how these technologies can be synergistically integrated within procurement processes. Future research should aim to develop holistic frameworks that combine multiple technologies to achieve sustained efficiency gains and scalability in procurement practices (Chen & Wang, 2018; Jones & Brown, 2016).

#### **Contextual Gaps**

In addition to conceptual gaps, there are significant contextual disparities that influence the adoption and effectiveness of emerging technologies in procurement. Existing research predominantly examines general applications across industries such as manufacturing and services. However, there is a lack of industry-specific insights that consider nuances in procurement dynamics across sectors like healthcare, construction, and retail. Furthermore, the impact of organizational size and type (e.g., SMEs vs. large corporations, public vs. private sectors) on technology adoption remains underexplored. Addressing these contextual factors would provide tailored strategies for optimizing technology adoption in diverse organizational contexts (Li & Zhang, 2017; Wang & Li, 2019).

#### **Geographical Gaps**

Geographical disparities also emerge in the literature on emerging technologies in procurement. The majority of studies are concentrated in developed economies like the USA, Europe, and China, neglecting insights from developing regions such as Latin America, Southeast Asia, and Africa. Comparative studies across different global regions are essential



to understanding regional disparities in technological infrastructure, regulatory environments, and cultural norms that influence technology adoption strategies and outcomes in procurement. Bridging these geographical gaps would contribute to more inclusive and globally applicable frameworks for leveraging emerging technologies in procurement practices (Zhang & Wu, 2018; Liu & Zheng, 2020).

By addressing these conceptual, contextual, and geographical gaps, future research can advance a comprehensive understanding of how emerging technologies can be effectively harnessed to enhance procurement efficiency and effectiveness across diverse organizational and global contexts.

### CONCLUSION AND RECOMMENDATIONS

#### Conclusion

The role of emerging technologies in improving procurement efficiency and effectiveness in Ghana has been transformative, driving significant advancements in the procurement landscape. The adoption of technologies such as blockchain, artificial intelligence (AI), Internet of Things (IoT), and big data analytics has streamlined procurement processes, enhanced transparency, and fostered better decision-making.

Emerging technologies have automated repetitive and time-consuming tasks, reducing manual errors and speeding up procurement cycles. AI and machine learning algorithms have enabled predictive analytics, allowing procurement professionals to forecast demand more accurately, optimize inventory levels, and negotiate better with suppliers based on data-driven insights. Blockchain technology has significantly enhanced transparency and trust in procurement activities. By providing an immutable ledger of transactions, blockchain ensures that every step in the procurement process is recorded and verifiable, reducing the risk of fraud and enhancing accountability. This transparency fosters stronger relationships with suppliers and stakeholders, improving overall supply chain integrity.

The IoT has facilitated real-time tracking of goods and assets, providing valuable data on the condition and location of items throughout the supply chain. This real-time visibility helps in managing logistics more efficiently, reducing delays, and ensuring timely delivery of goods. Big data analytics has empowered procurement teams with insights drawn from vast amounts of data, enabling more informed strategic decisions. These insights help in identifying cost-saving opportunities, optimizing supplier performance, and enhancing overall procurement strategy.

Despite these advancements, challenges such as the need for significant initial investments, data security concerns, and the requirement for skilled personnel to manage these technologies persist. However, the overall impact of emerging technologies on procurement in Ghana is overwhelmingly positive. These technologies have not only improved efficiency and effectiveness but have also positioned Ghanaian businesses to be more competitive in the global market, fostering sustainable growth and development in the procurement sector.

#### Recommendations

#### Theory

Advancing research into the integration of emerging technologies like blockchain, AI, IoT, RPA, cloud computing, big data analytics, and machine learning within procurement frameworks is crucial. Academic institutions and research bodies should encourage



interdisciplinary studies that explore the theoretical underpinnings and long-term impacts of these technologies on procurement efficiency and effectiveness. Longitudinal studies can offer valuable insights into how these technologies evolve over time and their broader implications for organizational strategy and competitiveness in procurement practices

#### Practice

Organizations can benefit significantly by investing in training and development programs tailored to equip procurement professionals with the skills needed to leverage emerging technologies effectively. Hands-on workshops, certification courses, and mentorship programs focused on technology integration should be prioritized to bridge existing skill gaps and build a workforce capable of implementing and managing these advanced procurement tools. Additionally, fostering a culture of innovation through pilot projects and case studies that demonstrate tangible benefits—such as reduced cycle times, enhanced transparency, and cost savings—can accelerate the adoption of these technologies across different sectors.

#### Policy

Governments and regulatory bodies play a pivotal role in creating an enabling environment for the widespread adoption of emerging technologies in procurement. Developing flexible regulatory frameworks that accommodate the unique characteristics and risks associated with these technologies, such as data privacy and cybersecurity concerns, is essential. Policymakers should also consider incentives such as tax credits, grants, and subsidies to encourage organizations to invest in technology upgrades and innovations that enhance procurement efficiency and effectiveness. By fostering collaboration between public and private sectors and promoting standards that ensure interoperability and data integrity, policymakers can support a sustainable ecosystem for technological advancement in procurement



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