

Original Article

Role of BDA in Improving Supply Chain Resilience

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Abstract - In the modern world of interconnected and globalized businesses, adapting and overcoming unexpected disruptions has become a crucial factor in maintaining competitiveness. As a result, supply chain resilience has become a vital aspect of supply chain success. The correlation between resilience and value is well-documented. The ability to rebound from challenges and disruptions has consistently allowed top-performing companies to outperform their competitors in terms of Total Shareholder Return (TSR) during times of crisis, regardless of their industry. This research paper explores the potential of utilizing Big Data analytics—which refers to examining large and varied datasets to uncover hidden patterns, correlations, and insights—and predictive modeling, a statistical technique that uses historical data to forecast future outcomes, to strengthen supply chain resilience. This research paper explores the potential of utilizing Big Data analytics and predictive modeling to strengthen supply chain resilience. By implementing advanced data technologies, this study seeks to equip organizations with the ability to proactively identify, evaluate, and mitigate risks, thereby enhancing the overall resilience of their supply chains. Integrating Big Data analytics and predictive modeling can revolutionize traditional supply chain management methods, empowering businesses to survive and thrive in the face of uncertainties and disruptions.

Keywords - Big Data Analytics, Supply chain resilience, Service complexity, Stakeholder diversity, Logistics.

1. Introduction

1.1. The Background

The complexity of modern supply chains can be attributed to several factors, such as the expanding reach of international commerce, the growing multitude of participants in the supply chain, and the rising intricacy of the goods and services being exchanged. Here are a few specific factors that contribute to the complexity of modern supply chains:

1.1.1. Globalization

Modern supply chains have become increasingly globalized, procuring products and services from various countries and regions.

As a result, supply chain management has become a complex task, requiring coordinating activities and managing relationships with diverse stakeholders across different cultural and legal contexts. [1]

1.1.2. Stakeholder Diversity

Modern supply chains often consist of a diverse array of stakeholders, comprising suppliers, producers, transportation specialists, distributors, and clients [2]. Managing these interrelated connections and synchronization of operations among distinct entities can significantly augment the intricacy of the supply chain[3].

1.1.3. Product and Service Complexity

Contemporary goods and services are often characterized by a high level of intricacy, encompassing many components and functionalities. As such, managing their supply chain becomes increasingly complex, encompassing the coordination of sourcing, production, and distribution processes for these diverse elements[2]. An increasing trend towards personalization The current market trend of consumer preference for personalized products and services has led to a higher level of intricacy in the supply chain. [4]

1.2. Statement of the Problem

This paper explores the potential role of integrating Big Data analytics and predictive modeling in enhancing supply chain resilience and mitigating the challenges organizations face in building resilient supply chains. Organizations often encounter several challenges while striving to establish a resilient supply chain. Supply chain disruptions can arise from various sources, such as natural disasters, geopolitical events, and pandemics. These events are often unpredictable, making it difficult for organizations to prepare for them. [5] Secondly, constructing a resilient supply chain necessitates measuring risks at different stages of the supply chain management process. However, effective risk measurement relies on accurate and timely data availability. Yet, data on supply chain risks may be fragmented, outdated, or dispersed across multiple systems, making obtaining a comprehensive



view of risks challenging. [6] Thirdly, the emphasis on optimizing supply chains and globalization has resulted in a fragmented decision-making process. This has caused the supply chain structure to break down, leading to reduced visibility, longer lead times, and the need for coordination among various decision-making entities. Dealing with conflicts of interest and imbalances in information sharing can be challenging, negatively impacting supply chains' resilience. [7] Lastly, balancing cost efficiency with resilience is challenging, as organizations often prioritize cost savings in supply chain design. However, achieving resilience may necessitate upfront investments and long-term payoff periods, which can be challenging to justify in the short term. [7]

1.3. Research Objectives

Many companies recognize the need to integrate digital technologies such as IoT, Cloud Computing, Blockchain, and CPS into their supply chain processes. However, there is not enough emphasis on utilizing Big Data analytics to improve supply chain resilience. To address this issue, this research study's main objective is to thoroughly analyze the potential of Big Data analytics and determine how it can significantly enhance supply chain resilience. The study aims to investigate the factors that contribute to the resilience of supply chains and explore how Big Data analytics can be used in conjunction with these factors to help organizations better understand and manage the challenges, uncertainties, and risks involved in their supply chain operations. The research will also provide insights into the best practices and strategies organizations can implement to leverage the benefits of Big Data analytics and create more robust and resilient supply chain networks. The research paper addresses a significant gap in the current understanding and application of Big Data analytics within supply chain management. While various digital technologies such as IoT, Cloud Computing, Blockchain, and Cyber-Physical Systems are increasingly recognized for their potential to enhance supply chain processes, there remains a notable lack of emphasis on the specific ways in which Big Data analytics can be leveraged to improve supply chain resilience.

This paper seeks to fill this gap by comprehensively analyzing Big Data analytics' potential contributions to building resilient supply chains. It focuses on the need for organizations to understand better the interplay between Big Data analytics and the factors that underpin supply chain resilience, offering insights into effective practices and strategies that can be implemented. By highlighting the importance of integrating Big Data analytics not only as a technological tool but as a critical component for mitigating risks and enhancing overall supply chain robustness, the research aims to provide actionable recommendations for organizations striving to navigate the complexities and uncertainties of modern supply chains.

2. Methodology

This section outlines the research methodology employed in this study to investigate the role of Big Data analytics in enhancing supply chain resilience. The research methodology comprises a qualitative approach, including a literature review and case studies, to comprehensively understand the topic. A systematic review of the existing literature was conducted to identify key concepts, frameworks, and findings related to Big Data analytics and supply chain resilience. Academic journals, industry reports, and conference proceedings were scrutinized to gather relevant information.

This phase aimed to highlight significant trends, challenges, and opportunities within the realm of Big Data analytics in supply chain management. Several case studies of leading organizations were analyzed to gain practical insights into applying Big Data analytics in real-world supply chain scenarios. Companies like Amazon, Walmart, and Procter & Gamble were selected due to their demonstrated commitment to leveraging data analytics for supply chain optimization. The case studies provided concrete examples of how these organizations successfully implemented Big Data solutions to enhance supply chain resilience and their challenges and outcomes. Qualitative data collected from the literature review, case studies, and expert interviews were analyzed using thematic analysis. Themes and patterns were identified to draw connections between Big Data analytics practices and their impact on supply chain resilience.

This analysis facilitated the identification of best practices, strategies, and critical factors that organizations can adopt to enhance their supply chain resilience through effective use of Big Data. Finally, the insights gained from the literature review, case studies, and expert interviews were synthesized to formulate actionable recommendations for organizations. The findings were aligned with the research objectives, providing a comprehensive framework for integrating Big Data analytics into supply chain management practices to bolster resilience. This mixed-methods approach ensures a thorough examination of Big Data analytics' role in supply chain resilience, allowing for a richer understanding of both theoretical and practical implications. The research methodology not only aims to fill the identified gaps in the current literature but also seeks to offer valuable insights for practitioners in the field.

3. Literature Review

3.1. Significance of Resilience in Supply Chain Management

Supply chain resilience refers to the capacity of a supply chain to withstand and bounce back from disruptions. It encompasses both the ability to withstand disturbances and the ability to operate efficiently after experiencing them. Another commonly referenced definition in the literature on

supply chain resilience is: “the adaptive capability of the supply chain to prepare for unexpected events, respond to disruptions, and recover from them by maintaining continuity of operations at the desired level of connectedness and control over structure and function” [8]. Resilience in the supply chain has a direct correlation with value. A study of around 1800 US companies conducted by BCG [9] from 1995 to 2020 showed that resilient companies outperformed their peers in terms of total shareholder return by a larger margin during crisis quarters. The difference in TSR almost doubles during crisis quarters, highlighting the significant impact of resilience on shareholder return during periods of instability.

As supply chains become more complex, they become more susceptible to vulnerability. Supply chain vulnerability is defined [10] as the extent to which the supply chain is exposed to a disruptive event. This vulnerability can be assessed by the impact or damage caused by external factors, such as changes in value, flexibility, product delays, or information-sharing processes. Within the supply chain framework, supply chain complexity, vulnerability, and resilience are interconnected concepts that significantly impact each other. The intricate and interdependent nature of supply chain operations, caused by complexity, can increase vulnerability to disruptions [10]. Vulnerability measures the supply chain's exposure to potential disruptions and the extent of damage that such events can cause. On the other hand, resilience refers to the supply chain's ability to withstand shocks, recover from disruptions, and adapt to new circumstances, ensuring the uninterrupted flow of operations [10]. Supply chain complexity can worsen vulnerability as complex systems may have more points of failure and lack transparency, making it challenging to anticipate and manage risks effectively. Employing resilience strategies can help manage complexity and vulnerability, enabling efficient responses to disruptions, effective risk management, and maintaining supply chain functioning. [11]

Research indicates that big companies such as Walmart and UPS use Big Data Analytics (BDA) to improve the resilience of their supply chain in multiple ways. They leverage BDA to optimize their inventory, logistics, and delivery routes, enhancing their supply chain responsiveness. Additionally, they monitor supplier performance to ensure merchandise's sustainable and responsible production.

3.2. Big Data in Supply Chain Management

Big Data enhances supply chain processes by providing valuable insights, improving decision-making, and optimizing operations. Here are some key roles of Big Data in supply chain processes:

3.2.1. Demand Forecasting

Big Data analytics has become a valuable asset for companies looking to improve their forecasting capabilities.

Organizations can effectively anticipate customer demand by analyzing past sales data, market trends, and external factors. Advanced analytical tools and methods allow businesses to predict trends better, prevent shortages, and optimize their inventory management

3.2.2. Inventory Management

Big Data is vital in improving inventory management by analyzing current data on stock levels, demand patterns, lead times, and supplier performance. Organizations can effectively address excess inventory, reduce carrying costs, and maintain timely product availability through predictive analytics on Big Data.

3.2.3. Supplier Relationship Management

Big Data analysis can improve supplier relationship management by evaluating supplier performance, identifying potential risks, and streamlining sourcing strategies. Companies can analyze supplier data and market trends using sophisticated analytics tools to make well-informed decisions about supplier selection, negotiation, and partnership.

3.2.4. Transportation and Logistics

Big Data is crucial in streamlining transportation and logistics processes. Through data analysis of routes, vehicle performance, traffic, and weather conditions, companies can enhance route planning, reduce transportation expenses, and improve delivery efficiency. Constant data analytics aids in monitoring shipments and effectively managing logistics operations.

3.2.5. Warehouse Operations

Big Data analysis can improve warehouse operations by examining data on stock amounts, processing time for orders, usage of storage space, and picking methods. Companies can use these insights to simplify warehouse procedures, enhance accuracy in fulfilling orders, and boost overall efficiency.

3.2.6. Risk Management

Big Data plays a significant role in managing and mitigating various logistics and supply chain systems risk categories. It enables predictive analytics to foresee operational risks, such as equipment failures, by optimizing maintenance schedules and identifying patterns from large volumes of data. Additionally, it facilitates the analysis of weather patterns and environmental conditions, helping companies anticipate natural disasters or extreme weather events, thereby minimizing their impact on supply chain operations. In terms of technological risks, Big Data enhances cybersecurity by detecting anomalies and potential threats in real-time, allowing for more effective responses to cybersecurity incidents. Market risks can also be mitigated as Big Data analytics help analyze market trends and consumer behaviour, enabling companies to adapt to fluctuations in demand and supply. Furthermore, Big Data assists with regulatory risks by providing insights into supply chain

processes, helping companies ensure compliance and quickly adjust to changing regulations.

4. The Role of Big Data in Supply Chain Resilience

Based on the literature review, it is evident that modern supply chains are becoming increasingly complex, with various challenges and disruptions that can negatively impact their resilience. While many organizations recognize the need to adopt digital technologies to improve their supply chain processes, not enough emphasis has been placed on utilizing Big Data analytics to enhance supply chain resilience. In this section, we will explore the potential role of Big Data analytics in mitigating organizations' challenges in building resilient supply chains. Many experts believe that the fourth industrial revolution (4.0) has the potential to improve sustainable supply chain resilience (SCRES) through the utilization of key technologies like Big Data analytics (BDA), the Internet of Things (IoT), and artificial intelligence (AI). [12] The presence of enabling technologies does not solely determine supply chain resilience. Several factors heavily influence the success of supply chain resilience. A proposed framework by [13] has identified key enablers greatly impacted by using Big Data when examining the factors contributing to supply chain resilience. These enablers include agility, (re-)engineering supply chain capabilities and collaboration.

4.1. Supply Chain Agility

Agility is a term commonly used in the supply chain literature to describe the ability of a firm to adapt rapidly to changing environmental conditions. According to multiple sources, agility is a combined element that encompasses both visibility and velocity [12]. Visibility, also called transparency, refers to the ability to access information on the identities, locations, and statuses of entities transmitting between lower-tier suppliers and customers in the supply chain [14]. This may include information on inventories, demand, supply conditions, and production and purchasing schedules [13]. Conversely, velocity focuses on the speed of an organization's flexible adaptations, with lead time as a key indicator. This includes the firm's flexibility to react quickly to new environmental conditions, particularly when facing manufacturing, transportation, sourcing, or labour disruptions.[15]

Modern customers value receiving alerts that provide actionable insights to mitigate risks and increase efficiencies rather than just basic visibility [16]. Big Data Analytics (BDA) significantly improves supply chain visibility by integrating real-time data from various sources, both internal and external, into the supply chain and converting it into actionable insights for decision-making [17]. These insights can be used in both a predictive and prescriptive manner. BDA consolidates data from different platforms and systems to provide a comprehensive view of the supply

chain, enhancing visibility into all operational aspects. BDA also enables predictive analytics to anticipate and prepare for potential supply chain disruptions. Other ways in which BDA enhances supply chain visibility include real-time monitoring, digital supply chain twins, and end-to-end visibility [12]. Furthermore, BDA can improve market visibility through predictive analytics, leading to more accurate demand and sales forecasts. [18] Big Data Analytics (BDA) enhances supply chain velocity by enabling the early detection of risks and the faster execution of mitigation measures. For instance, BDA can be used to find alternative transportation routes during infrastructure disruptions, thereby improving the speed of response to Supply Chain Disruptions (SCDs) [19]. Additionally, BDA supports the development and execution of continuity plans in times of SCDs, which contributes to maintaining or quickly restoring the flow of goods and services in the supply chain [12].

4.2. Re-engineering Supply Chains: Supplier Relationship Management

Data analytics plays a critical role in enhancing purchasing and supplier relationship management. Misinformation about suppliers can harm organizations, but leveraging data analytics enables organizations to tackle supplier issues, forecast lead times, and foresee on-time deliveries. This empowers procurement managers to adapt operational approaches and uphold positive supplier relationships. The process involved in utilizing Big Data Analytics (BDA) to improve Supplier Relationship Management (SRM) includes several key steps: [20]

4.2.1. Performance Analysis for Decision Making

Big data about supplier performance, including cost, turnaround time, quality, agility, sustainability, and other factors, assists purchasing managers in addressing supplier problems or in making decisions about switching suppliers or sourcing from different regions.

4.2.3. Predictive Analytics for Proactive Management

Organizations can use predictive analytics to become proactive rather than reactive in various procurement activities by efficiently gathering and analyzing supplier data. This includes predicting supplier lead times and developing strategies for coping with lead time variations.

4.2.4. Foreseeing Delivery Issues

Big data modules can predict on-time and late deliveries by aggregating and analyzing historical inbound shipment data, manufacturing data, purchase order confirmations, and trend information from the supplier portal. This allows purchasing managers to activate contingency plans before operations are interrupted.

4.2.5. Recommendations for Inventory Management

Once the big data module is trained, it can help predict whether parts will be shipped on time, specify lead time data

at a part level, recommend appropriate inventory levels for both buyers and suppliers and share this lead time data with the enterprise system for better management.

4.3. Re-engineering Supply Chains: Supply Chain Design

When applied to the context of Supply Chain Resilience Engineering and Science (SCRES), the key principles of supply chain resilience revolve around the trade-off between maximizing efficiency and building redundancy in a supply network [13]. Prescriptive analytics, a crucial tool in big data analytics, employs complex algorithms to identify and assess alternative solutions. This approach utilizes techniques like simulation and optimization [18] to aid in designing a supply chain. Organizations can use prescriptive analytics to evaluate various network configurations and redundancy elements, such as supplier quantity, geographic locations, inventory levels, and production and transportation capacities [13]. This enables companies to strike a balance between efficiency and redundancy, ultimately optimizing their supply chain operations to achieve maximum resiliency.

4.4. Re-Engineering Supply Chains: Scenario Analysis

Scenario planning is a crucial step in the development and evaluation of potential disruptions to a supply chain, as well as in establishing effective contingency plans. The main challenge for organizations here is to anticipate and simulate various scenarios to build resilience in their supply chains. Big Data Analytics (BDA) enhances the understanding of supply chain networks through simulations by integrating diverse data sources, including structured, semi-structured, and unstructured data [21]. This comprehensive data integration allows for the creation of detailed simulations that model various aspects of the supply chain, such as dynamics and potential risk scenarios. These simulations enable a deeper numerical understanding of the supply chain network, facilitating the testing of alternative scenarios and the assessment of their potential impacts [22]. This approach is particularly useful for developing and executing continuity plans during supply chain disruptions, as it allows for exploring various scenarios to find the most effective response strategies [20].

Big Data Analytics (BDA) and Digital Twins are closely related in that BDA provides the foundational data processing and analysis capabilities necessary for creating and operating Digital Twins. BDA's comprehensive data analysis capabilities are crucial for developing Digital Twins, virtual representations of physical supply chain networks [20]. BDA can be combined with traditional simulation techniques to generate these digital SC twins, enabling real-time and predictive decision-making by mirroring the real-world supply chain network at any given moment (Meriton et al., 2020). Thus, BDA underpins the functionality of Digital Twins by processing and analyzing the vast amounts of data they require to simulate and accurately predict their physical counterparts' behavior.

4.5. Supply Chain Collaboration

Big Data applications, along with other technologies such as AI and Cloud Computing [12], enhance the mechanism of communicating important findings on risks and supply chain disruptions with Supply Chain (SC) partners through the analysis of unstructured data, which constitutes over 80% of the total volume of organizational data. This analysis allows for identifying and understanding resilience enablers within supply chain networks [24]. By employing Big Data analysis, supply chain partners can better understand the risks and disruptions faced, enabling swift trust, quality information sharing, and effective public-private partnerships. These factors are crucial for shaping supply chain resilience and ensuring a coordinated response to disruptions. Supply chain partners can communicate important findings more efficiently through the strategic and operational tools provided by Big Data applications [25], leading to improved decision-making and resilience in the face of supply chain disruptions [12].

5. Case Study

Retail leaders such as Amazon, Walmart, Tesco, and consumer goods companies such as Procter & Gamble have significantly benefited from the adoption of big data analytics. Building a resilient supply chain capable of withstanding various disruptions is crucial. Big data analytics provided these companies with the tools necessary for predictive risk management, offering insights that enabled them to anticipate and respond to challenges more effectively. For example, Walmart required all suppliers to use its Retail Link platform, facilitating the exchange and sharing of data across the extended enterprise. This provided transparency and enabled coordinated cross-enterprise efforts.

Logistics companies such as DHL and UPS utilize big data solutions to improve operational results. By leveraging big data, they can enhance route optimization and proactive risk management and improve the responsiveness of their supply chains. These companies are utilizing big data solutions to significantly improve their supply chain resilience by taking a proactive approach to various risks. For example, by analyzing GPS data in conjunction with traffic and weather information, these companies can dynamically plan and optimize delivery routes to avoid delays. This capability not only improves the efficiency of the supply chain but also increases its robustness against unforeseen disruptions.

Manufacturing firms also use Big Data Analytics (BDA) to improve supply chain resilience by optimizing production and inventory, identifying bottlenecks, predicting customer demands, and supporting logistics planning. BDA enables manufacturers to discover new information, identify patterns, and simplify processes, thereby increasing efficiency. By addressing poorly performing components, manufacturers

can ensure smooth and efficient operations, contributing to the supply chain's resilience. BDA also helps accurately predict customer demands, reducing overproduction or stock-outs and aligning production with market demand. RFID-enabled big data supports shop floor logistics planning and scheduling, optimizing resource allocation and production activities, further strengthening the supply chain's resilience.

6. Challenges and Limitations

Implementing big data analytics (BDA) in supply chain management faces several challenges, including:

6.1. Lack of sufficient resources

Supply chain networks often exhibit significant variability across organisations in data and analytics resource capabilities. This disparity can hinder effective information and data sharing due to insufficient IT capabilities. To effectively implement BDA, forming cross-functional teams and fostering collaboration among various firm elements is crucial. However, forming these teams requires careful consideration of data-sharing policies, incentive arrangements, and promoting a data-driven culture for business value creation through BDA.

6.2. Barriers specific to manufacturing supply chains

In the context of manufacturing supply chains, additional barriers to BDA adoption have been identified. These include organizational culture, lack of top management support, and insufficient training and education on BDA tools and techniques. These barriers highlight the need for a strategic approach to BDA implementation that addresses technical and organizational challenges.

6.3. Complexity of Supply Chains

The increasing complexity due to globalization and the unpredictability of business environments exacerbates the problem of supply chain disruptions, making the implementation of big data analytics more challenging.

6.4. Quality of Demand Information

Perceived deficiencies in the quality of demand information can have significant consequences, affecting the effectiveness of big data analytics in improving supply chain operations.

6.5. Integration and Service Performance

Integrating big data analytics while maintaining or improving service performance poses a significant challenge for third-party logistics providers.

6.6. Data Analytics Capability and Organizational Flexibility

Developing the necessary data analytics capability and organizational flexibility to complement supply chain resilience is a complex process that requires significant investment and strategic planning.

6.7. Data Fragmentation

Data fragmentation during the implementation of Big Data presents significant challenges, primarily due to inconsistent data formats that complicate integrating and analysing information from diverse sources. To mitigate these challenges, several strategies may be employed. Establishing standardized data formats across all sources and using middleware can bridge gaps between disparate systems. In contrast, data cleansing and transformation tools such as OpenRefine and Trifacta can enhance data quality. Furthermore, data integration platforms like Talend and Apache NiFi can streamline the process of managing fragmented data, thereby improving overall analytical capabilities.

7. Future Research

Future research on the role of Big Data in the supply chain resilience should focus on several essential aspects. Firstly, there is a need to explore how Big Data can enhance risk management strategies and improve the capability to predict and mitigate disruptions within supply chains. Additionally, examining the integration of Big Data with emerging technologies such as the Internet of Things (IoT), artificial intelligence (AI), and blockchain can further bolster supply chain agility and responsiveness. Another critical area of focus should be the development of frameworks that ensure data quality and governance in Big Data applications, thereby maintaining the integrity and reliability of supply chain data. Moreover, advancing predictive analytics models is vital for better forecasting demand and potential supply chain disruptions, which are crucial for enhancing overall resilience. Lastly, it is essential to evaluate the impact of Big Data on sustainable supply chain practices while addressing ethical concerns related to data privacy and security.

8. Conclusion

In conclusion, the analysis highlights the critical need for integrating advanced data technologies, particularly Big Data analytics and predictive modeling, to enhance the resilience of modern supply chains amidst increasing complexities and disruptions. This paper has demonstrated that these technologies enable organizations to proactively identify, assess, and mitigate risks, thereby significantly bolstering the capability to withstand unforeseen challenges. The study emphasized that the advantages of adopting Big Data analytics extend beyond mere risk mitigation; they can fundamentally transform traditional supply chain management practices. Organizations can ensure survival and achieve competitive advantage in a volatile environment by optimising operations, improving customer satisfaction, and reducing costs. Furthermore, while implementing these technologies presents challenges—such as data fragmentation, unequal information sharing, and the need for initial investments—the long-term benefits significantly overshadow these hurdles. Organizations must adopt a strategic approach that encompasses the development of

robust data governance frameworks and effective collaboration across the supply chain. By doing so, they can enhance their agility, responsiveness, and overall resilience, ultimately securing their position in the global marketplace.

Therefore, embracing Big Data analytics and predictive modeling is essential for companies seeking to navigate and thrive amid the uncertainties of today's dynamic business landscape.

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