

UTILIZING BIG DATA ANALYTICS FOR DEMAND PLANNING AND INVENTORY OPTIMIZATION IN SUPPLY CHAIN MANAGEMENT

Kosalee Thameera Galkaduwa Procurement / Purchasing Omegaline Ltd Sadalankawa, Sri Lanka

Abstract

Big Data Analytics (BDA) has revolutionized supply chain management (SCM), enabling precise demand planning and optimized inventory management. This study investigates BDA's role in addressing forecasting inaccuracies, resource misallocation, and service inefficiencies, utilizing empirical and industrial evidence. The findings demonstrate BDA's capabilities through predictive models, real-time tracking, and optimization algorithms that enhance operational efficiency and reduce costs. Case studies from industry leaders like Zara and Amazon illustrate how BDA minimizes stock discrepancies and aligns inventory with market demand. However, challenges such as data silos and skill shortages limit its broader adoption. The research emphasizes strategic investments in data integration and skill development to maximize BDA's potential. This study contributes to the understanding of leveraging BDA for sustainable SCM improvements.

Keywords: Big Data Analytics, Supply Chain Management, Demand Planning, Inventory Optimization, Predictive Analytics, Operational Efficiency.

I. INTRODUCTION

Big data analytics integration into supply chain management is strategic refinement in demand planning and optimization of inventory. Big Data Analytics is a process that involves using sophisticated programs to analyze large data sets to accurately forecast customer demand to allow for effective stocking of products. These innovations are vital, particularly in growing the cost-effectiveness of the supply chain and the level of service delivery [1].

Current studies show that predictive analytics and machine learning techniques are useful for pattern recognition and increasing the accuracy of forecasts, allowing for the change of inventory approaches concerning the current fluctuation of markets. For example, clustering and reinforcement learning methods ensure proper placement of inventory and achieve high levels of service and low costs. These applications have been particularly useful in retail, manufacturing, and logistics sectors, which has highlighted improvement in lead times, and increased organizational flexibility in response to market changes [2] [3] This study aims to explore BDA's role in optimizing supply chains by consolidating empirical and industrial evidence, addressing gaps in predictive accuracy and resource utilization.



II. RESEARCH PROBLEM

Global supply chains are undergoing a dramatic entropy tied to the diverse market conditions and demand patterns, primarily as perceived by end-consumers, indicating the need to opt for the improvement of demand planning and inventory optimization algorithms. Several opportunities come with the use of Big Data Analytics (BDA) but it is also faced with various challenges. Lack of proper data sources and availability, decision-makers who are not proficient in analyzing data, and no structural form of integrated solutions for predictions are the main causes. Some common issues that Companies face are overstock and stockout which harm the company's balance sheet and customer satisfaction [4].

The retail and manufacturing industries annotate important areas of weakness. For example, most of the current demand planning systems lack real-time data processing, which leads to a mismatch of production and customer requirements. Various companies, including Zara, utilize analytics to achieve optimal inventory management in real time [5]. However, these systems are still not implemented in many organizations, and their operational costs and wastage rates remain significantly high. Such challenges underscore the importance of having a systematic approach to utilising BDA to the optimum.

III. RESEARCH OBJECTIVES

- To identify barriers to adopting BDA in demand forecasting and inventory management.
- To develop strategies to improve data integration and predictive accuracy.
- To assess the impact of BDA on cost efficiency and service level improvements in supply chains.

IV. RESEARCH SCOPE

This study focuses on the integration of Big Data Analytics (BDA) in supply chain management (SCM), particularly in demand planning and inventory optimization. It evaluates how BDA-driven technologies such as machine learning, predictive modelling, and real-time analytics enhance forecast accuracy and resource utilization.

V. LITERATURE REVIEW

Big Data Analytics (BDA) has significantly transformed SCM in the recent past through the progressive improvement of demand forecasting and inventory control. BDA currently employs large datasets with the application of computational tools to address stochasticity in demand forecasts and resource management within supply chain systems. This review offers an outline of major theories, models, and applications to capture the nature and impact of its transformations in SCM.

The Resource-Based View (RBV) framework forms the foundation of the majority of the works in BDA in SCM, pointing at the ability of this approach to generate sustainable competitive advantages through integrating technologies. Supply Chain Operations Reference (SCOR) is a model that organizes key performance indicators by assessing the effectiveness of a supply chain.



When incorporating the BDA subroutine into the SCOR model, the solution acquires predictive modelling for the amount of demand variation and the requirement for inventory changes that tie together the company's strategic operations with the tactic level [6].

One of the ways applied in predictive analytics is the use of a range of ML algorithms, including regression analysis and neural networks, for higher accuracy of demand forecasting. Applications like cluster and affinity analysis make it easier to categorize buyer groups and one's stock about buyer behaviour. For instance, Zara has applied an itm2020 RFID-based real-time analytical solution that provides centralized data processing to uncover and eliminate excess inventory. Such anticipatory and instantaneous demand forecasting has placed Zara at the helm of the fast fashion SCM [7]. Prescriptive analytics also helps in decision-making by using models to predict and plan the efficient distribution of inventory through supply chain networks around the globe. Such procedures as reinforcement learning are performed similarly to decision-making procedures with less cost and greater flexibility compliant with changes in the market [8].

However, there are several challenges which limit the application of BDA in SCM, which include; data integration challenges, scarcity of skilled personnel in the field and variabilities in the quality of data. It is still rare to manage the level of integration necessary to take advantage of real-time analysis, which creates gaps in decision-making. To overcome these barriers, core strategies need to be developed to propel the promotion and use of BDA forward.

VI. RESEARCH METHODOLOGY

This research adopts a secondary research approach collecting data from industrial reports, peerreviewed journals and documented case studies to assess the impact of Big Data Analytics (BDA) on the supply chain management (SCM) project concentrating on demand planning and inventory optimization. Core examples like Zara using an RFID system to track the stock in real-time and Amazon utilizing predictive analytics for altering stock placement were discussed critically. Conceptual models such as the Resource-Based View (RBV) and the Supply Chain Operations Reference (SCOR) model offered the conceptual underpinning, and qualitative synthesis was employed to compile findings from the research studies. Clustering, machine learning, and reinforcement learning were also evaluated to improve the aspect of predicting and aiding in inventory management. This approach allowed for pointing out such industrial concerns as the problem of data isolation, skill deficits, and inconsistency in data quality with recommendations on how to overcome them and increase organizational productivity.

VII. DATA ANALYSIS & FINDINGS

7.1 Enhancing Demand Planning

Demand planning is critical for aligning production and supply strategies with market demand. BDA enhances this by improving forecast accuracy through predictive analytics, which analyzes historical data and real-time signals to identify patterns and trends.

7.2 Machine Learning and Predictive Modeling: Algorithms such as regression models, neural networks, and clustering techniques analyze past sales data, seasonality, and external factors like market trends. For example, Amazon employs machine learning models to predict demand



variations, reducing forecast errors and aligning inventory levels with actual needs [6].

Zara's Agile Response System: Zara's SCM integrates BDA to analyze sales data collected via RFID tags at store levels. This system allows the company to adjust inventory replenishment cycles dynamically, ensuring stock availability for trending products while minimizing overstocking [7].

Real-Time Integration: Walmart utilizes real-time sales data through predictive analytics, optimizing demand forecasts across its extensive retail network. This enhances supply chain visibility and minimizes discrepancies between supply and demand [9].

7.3 Optimizing Inventory Management

BDA provides tools to address inventory challenges, balancing stock levels to minimize holding costs while maximizing service levels. Key techniques include descriptive analytics and simulation models.

Real-Time Tracking and Replenishment: Technologies like RFID and Internet of Things (IoT) sensors are pivotal in tracking inventory movement. Walmart's centralized data system integrates real-time updates, reducing inventory mismanagement and associated costs.

Safety Stock Optimization: Procter & Gamble uses simulation models supported by BDA to optimize safety stock levels. By analyzing historical and market data, they adapt stock thresholds dynamically, reducing risks of stockouts during demand surges [10].



Figure 1 Real-world supply chains at P&G Beauty & Grooming span multiple echelons

Amazon's Dynamic Allocation: Amazon's inventory systems integrate affinity analysis to allocate inventory to warehouses based on regional demand. This approach reduces delivery lead times and enhances service quality.



Table 1 Comparison of Traditional vs. BDA-Enabled Inventory Systems

Parameter	Traditional Systems	BDA-Enabled Systems
Lead Time	Weeks	Days
Forecast Accuracy	~70%	90%+
Holding Costs	High	Reduced by ~30%
Service Level (Stockouts)	Frequent	Rare (<5%)

VIII. FINDINGS

8.1 Enhanced Operational Efficiency

BDA implementations enable organizations to optimize supply chain processes by integrating realtime data, predictive modelling, and automation. This results in higher forecast accuracy, improved inventory turnover, and lower operating costs.

Cost Savings: Companies such as Zara and Walmart report significant reductions in inventory carrying costs – up to 30% – due to BDA-driven replenishment systems.

Productivity Gains: Real-time analytics reduces manual efforts in tracking and decision-making, improving operational agility.

8.2 Improved Customer Satisfaction

By aligning supply chains to real-time demand signals, BDA ensures product availability and timely delivery, enhancing customer experiences. For instance, Zara's agile replenishment cycles ensure that customers find popular products in stock, bolstering brand loyalty.

8.3 Challenges and Barriers

Data Silos and Integration: Fragmented data sources across organizations hinder the seamless adoption of BDA systems.

Skill Gaps: Implementing sophisticated BDA tools requires skilled data analysts and IT professionals, which many companies lack

Data Quality Issues: Incomplete or inaccurate datasets lead to flawed predictions, highlighting the need for robust data governance frameworks.

IX. CONCLUSION

This research was able to engage the adoption of Big Data Analytics (BDA) in improving SCM, especially in the areas of demand planning and inventory optimisation. Overall, the research objectives of outlining the barriers, strategies for data integration, and assessment of BDA's effects on operational intensity were met by combining the appreciation of theoretical and practical data. The findings regard the use of predictive and prescriptive analytics as having a positive impact on



increasing forecast capability, decreasing costs, and optimizing customer satisfaction. For example, case prosecutions of companies such as Zara and Amazon give an understanding of the benefits of BDA in managing stock with demand statistics. Taking into account such barriers as data isolation and skill gaps, the study establishes that BDA is a pivotal intervention for realizing competitive advantages in SCM, highlighting the value of strong data stewardship and organizational commitment.

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