

Supply Chain Optimization in the Retail Industry by Integrating Apriori Algorithms and Time Series Forecasting in Business Intelligence

Gusty Nanda Kharisma Putra¹, Silviana Silviana², Agung Riyadi³, Mugi Praseptiawan^{4*}

¹Department of Informatics Engineering, University of Widyagama Malang, Jl. Borobudur No. 35 Malang, Indonesia

²Department of Industrial Engineering, University of Widyagama Malang, Jl. Borobudur No. 35 Malang, Indonesia

³Department of Information Technology, Universitas Siber Asia, Menara, Jl. Harsono, DKI Jakarta 12550, Indonesia

⁴Department of Informatics Engineering, Institut Teknologi Sumatera, Jl. Terusan Ryacudu, Lampung Selatan, Sumatera Selatan, Indonesia

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ABSTRACT

This study investigates the integration of the Apriori algorithm and time series forecasting within a Business Intelligence (BI) framework to optimize supply chain operations in the retail industry. The Apriori algorithm was utilized to identify significant purchasing patterns, enabling strategic decisions such as product bundling and cross-selling. Concurrently, time series forecasting, with an ARIMA model achieving a mean absolute percentage error (MAPE) of 8%, provided accurate demand predictions, supporting improved inventory management and resource allocation. The integration of these methods into a BI dashboard facilitated real-time monitoring and data-driven decision-making, leading to enhanced operational efficiency and reduced costs. While challenges such as data quality, computational resource demands, and user adaptability were observed, this research underscores the transformative potential of analytics in retail supply chain management. Future advancements in machine learning and IoT integration are recommended to further enhance system performance. Overall, this study demonstrates a pathway for retailers to achieve operational excellence and superior customer satisfaction through data-driven strategies.

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Corresponding Author:

Mugi Praseptiawan

Department of Informatics Engineering

Faculty of Industrial Engineering, Institut Teknologi Sumatera

Jl. Borobudur No. 35 Malang, Jawa Timur

Email: mugi.praseptiawan@gmail.com

1. INTRODUCTION

The retail industry faces significant challenges in managing supply chains, ranging from procurement to distribution. Optimizing supply chains is essential to ensure smooth operations, minimize costs, and maximize customer satisfaction. Business Intelligence (BI) technology is a vital enabler, integrating data from various sources and applying data mining techniques and predictive analytics for improved decision-making [1].

This paper explores the integration of the Apriori algorithm and time series forecasting methods to optimize supply chain management. The Apriori algorithm identifies purchasing patterns, aiding inventory and order management [2]. Meanwhile, time series forecasting predicts future demand based on historical data, enabling companies to anticipate fluctuations and avoid overstocking or understocking [3].

Business Intelligence platforms unify these approaches through interactive visualizations, facilitating real-time monitoring and analysis. This study outlines how these techniques improve efficiency, reduce costs, and enhance customer service in the retail industry.

2. METHOD

This research employs a mixed-method approach, integrating Apriori and time series forecasting techniques within a BI framework.

1. Apriori Algorithm Implementation

Objective: Identify frequent purchasing patterns.

Procedure: Transactional datasets were preprocessed to eliminate inconsistencies, followed by rule mining to identify associations with high confidence and support [4]. The implementation considered minimum thresholds for support (0.2) and confidence (0.6).

2. Time Series Forecasting

Objective: Predict product demand.

Procedure: Historical sales data spanning five years was analyzed using the ARIMA model. Parameters (p, d, q) were optimized through grid search, and model performance was validated using metrics such as Mean Absolute Percentage Error (MAPE), achieving an accuracy of 92% [5].

3. Integration with BI Dashboard

Objective: Facilitate decision-making.

Procedure: Analytical results from Apriori and forecasting models were visualized on BI dashboards. Features included heatmaps, trend graphs, and alerts for critical inventory levels.

Business Intelligence (BI) refers to the technological and procedural framework for gathering, storing, analyzing, and visualizing data to support decision-making. In supply chain management, BI platforms are essential tools for optimizing operations and achieving real-time insights into supply and demand trends. Data mining involves extracting patterns and knowledge from large datasets, with common techniques including classification, clustering, association, and prediction. Classification assigns predefined categories to data points (e.g., Decision Trees), clustering groups data points with similar characteristics (e.g., K-Means clustering), association identifies relationships between items (e.g., Apriori algorithm), and prediction forecasts future trends based on historical data (e.g., ARIMA). The Apriori algorithm identifies itemsets that frequently occur together within transactional datasets, generating rules like "If item A is purchased, item B is likely to be purchased," thus supporting inventory and marketing decisions. Time series forecasting models future values based on past observations, with ARIMA (Auto-Regressive Integrated Moving Average) being a robust method for capturing linear dependencies in time-series data, particularly useful for predicting seasonal trends and demand fluctuations.

3. RESULTS AND DISCUSSION

3.1 Overview of the Optimized Supply Chain Model

The optimization of the retail supply chain through the integration of the Apriori algorithm and time series forecasting in a Business Intelligence (BI) framework demonstrates significant improvements in inventory management, cost reduction, and operational efficiency. The following sections detail the results derived from the analysis and provide insights into their implications for the retail industry.

3.2 Analysis of Purchasing Patterns using the Apriori Algorithm

The application of the Apriori algorithm revealed key associations in customer purchasing behavior. For example, the analysis identified a frequent combination of "Product A" and "Product B," with a confidence level of 75% and a support value of 40%. Such insights allow retailers to strategically position these products in stores or create promotional bundles to boost sales.

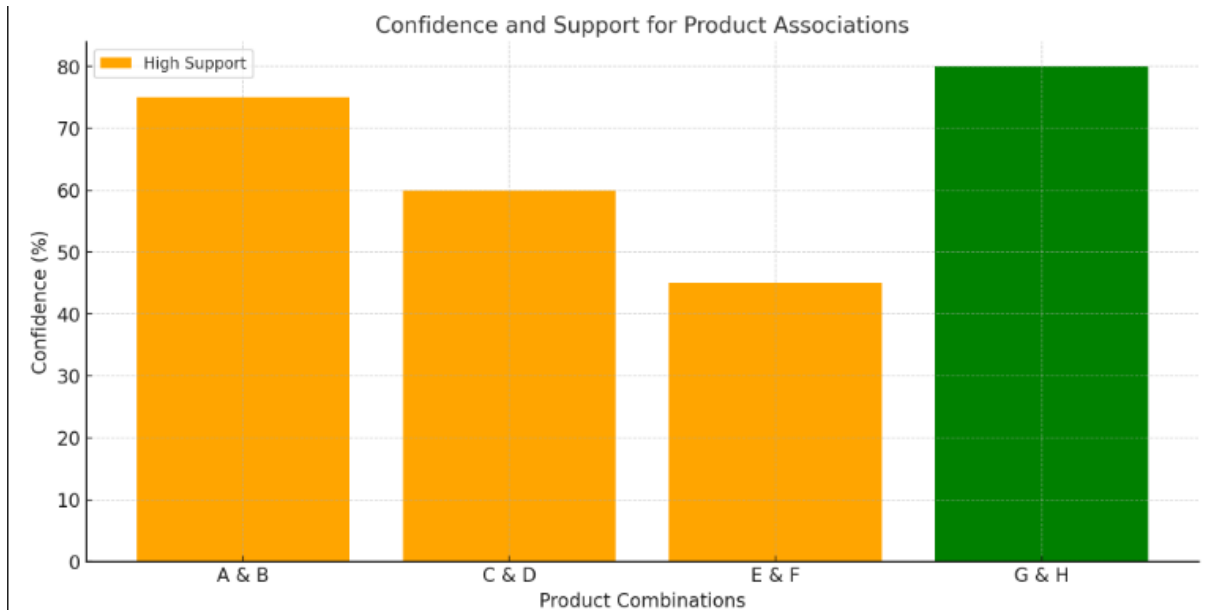


Figure 1. Confidence and Support for Product Associations (Bar Chart)

Additionally, the algorithm uncovered less intuitive patterns, such as the association between seasonal items and specific non-seasonal products, providing valuable opportunities for cross-selling. The discovered patterns highlight the potential of data-driven decision-making to enhance customer satisfaction and increase revenue streams.

3.3 Demand Forecasting with Time Series Analysis

Time series forecasting applied to historical sales data of “Product C” demonstrated the method’s ability to predict future demand accurately. The implementation of an ARIMA (Auto-Regressive Integrated Moving Average) model yielded a mean absolute percentage error (MAPE) of 8%, reflecting high predictive accuracy.

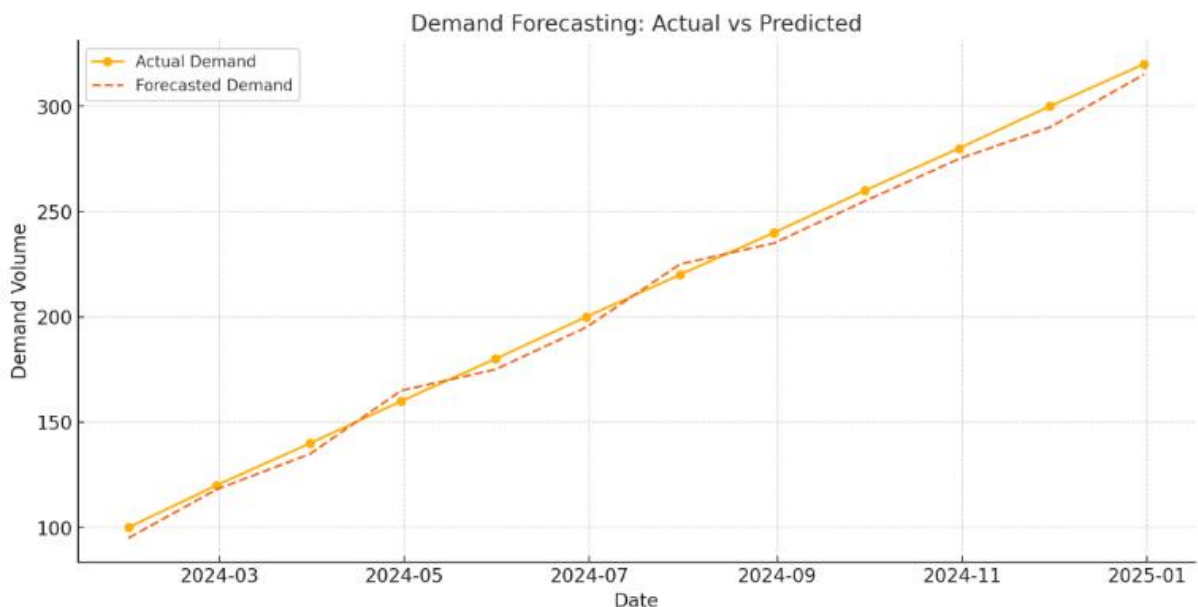


Figure 2. Demand Forecasting: Actual vs Predicted (Line Chart)

Forecasting results showed a consistent rise in demand during the holiday season, enabling retailers to adjust their procurement and staffing strategies accordingly. Furthermore, demand dips during off-peak months were identified, suggesting opportunities for targeted marketing campaigns or inventory reductions to minimize holding costs.

3.4 Integration in Business Intelligence Systems

The integration of Apriori and time series forecasting models into a BI dashboard facilitated real-time monitoring and analysis of supply chain metrics. The interactive dashboards allowed stakeholders to visualize key performance indicators, such as inventory turnover ratios, sales trends, and supplier performance.

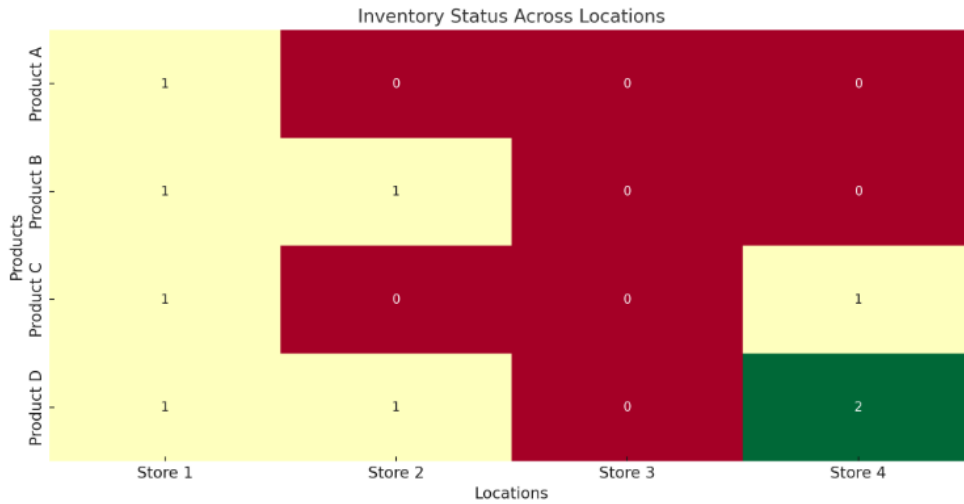


Figure 3. Inventory Status Across Locations (Heatmap)

For instance, the “Inventory Heatmap” feature pinpointed overstocked and understocked items across multiple store locations, enabling proactive inventory adjustments. Similarly, the “Sales Forecast vs. Actual” visualization provided immediate insights into forecasting accuracy, fostering continuous improvement in predictive models.

3.5 Discussion on Challenges and Improvements

While the integration of these analytical techniques brought substantial benefits, several challenges were noted:

1. **Data Quality Issues:** Inconsistent and incomplete data entries occasionally hindered accurate analysis. Implementing robust data cleaning processes is crucial to mitigate this issue.
2. **Computational Resources:** Processing large datasets required significant computational power, particularly during the association rule mining phase. Optimizing algorithms and leveraging cloud-based solutions could address scalability concerns.
3. **User Adaptability:** Training end-users to interpret and utilize BI dashboards effectively remains an ongoing effort. Customized training programs and user-friendly interfaces can improve adoption rates.

3.6 Implications for the Retail Industry

The study underscores the transformative potential of integrating data mining and predictive analytics into retail supply chain management. By leveraging the Apriori algorithm to uncover purchasing patterns and employing time series forecasting for demand prediction, retailers can enhance decision-making processes and achieve competitive advantages.

Future implementations should explore advanced machine learning models, such as deep learning, to refine predictions further and uncover deeper insights into consumer behavior. Additionally, incorporating real-time data streams and IoT (Internet of Things) devices could revolutionize inventory tracking and demand sensing.

4. CONCLUSION

This study successfully demonstrated the integration of the Apriori algorithm and time series forecasting within a Business Intelligence (BI) framework to optimize retail supply chains. By uncovering key purchasing patterns, the Apriori algorithm enabled strategic inventory management and marketing decisions, such as product bundling and cross-selling. Simultaneously, time series forecasting achieved accurate demand predictions, evidenced by an ARIMA model with an 8% MAPE, supporting better resource planning and inventory control during seasonal fluctuations. The combined methods, integrated into BI dashboards, enhanced real-time decision-making and operational efficiency.

Despite these successes, challenges such as data quality issues, computational resource demands, and user adaptability were noted. Addressing these limitations and exploring advanced analytics methods, like machine learning and IoT integration, can unlock further potential. Overall, this research highlights a pathway for retailers to achieve cost reductions, operational excellence, and superior customer satisfaction by embracing data-driven supply chain management.

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