

# Big Data Analytics for Predicting Customer Behavior in Digital Marketplaces

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## Abstract

The rapid growth of digital commerce has generated vast amounts of data from customer interactions within online marketplace platforms. This study aims to analyze the role of Big Data Analytics in predicting customer behavior in digital marketplaces. The research employs a qualitative research approach with a descriptive design to explore how data-driven strategies are used to understand consumer behavior and support business decision-making. Data were collected through in-depth interviews with digital marketing managers and data analysts, questionnaires distributed to licensed employees working in digital marketing and analytics roles, as well as observational analysis of customer interaction patterns on digital marketplace platforms. The results indicate that big data analytics plays a crucial role in identifying customer preferences, predicting purchasing patterns, and improving marketing effectiveness. Predictive models based on transaction history, browsing behavior, and customer reviews enable companies to develop personalized recommendation systems and targeted promotional strategies. These analytical capabilities significantly enhance customer engagement and increase sales performance in digital marketplaces. Furthermore, the findings highlight that organizations implementing advanced data analytics technologies gain competitive advantages through improved customer insights and more efficient marketing strategies. Despite several limitations related to sample size and qualitative data interpretation, this study provides valuable insights into the strategic importance of big data analytics for understanding consumer behavior in digital commerce ecosystems. The study also offers practical implications for businesses seeking to implement data-driven decision-making in the rapidly evolving digital economy.

**Keywords:** Big Data Analytics, Customer Behavior Prediction, Digital Marketplace, Data-Driven Marketing, Consumer Behavior.

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## INTRODUCTION

The rapid development of digital technology has significantly transformed the way people conduct economic activities, particularly in commercial transactions through digital marketplace platforms (Atikah et al., 2023). In recent years, the growth of global e-commerce has increased substantially, driven by wider internet penetration, the widespread use of mobile devices, and changing consumer behavior that increasingly relies on digital technology to meet daily needs

(Asyifah et al., 2023). Marketplace platforms such as Amazon, Alibaba, and Tokopedia have become digital ecosystems that connect millions of sellers and buyers in real time (Almunawar et al., 2025). These massive transactional activities generate enormous volumes of data, including product search data, purchase histories, customer reviews, and user interactions within digital platforms. This phenomenon is part of the development of Big Data, which is characterized by high volume, velocity, and variety of data. The utilization of such large-scale data offers strategic opportunities for companies to better understand consumer behavior patterns (Huang et al., 2018).

However, the increasing amount of data generated by marketplace users is not always accompanied by adequate analytical capabilities. Many companies still face difficulties in managing and extracting meaningful value from the available data (Kumar et al., 2023). Without appropriate analytical approaches, large datasets may only become collections of information that provide little contribution to business decision-making. Therefore, the implementation of Big Data Analytics has become increasingly important to process and analyze massive datasets in order to generate valuable insights for organizations. Effective data analysis enables companies to identify customer preferences, predict purchasing patterns, and design more targeted marketing strategies. Consequently, the use of advanced data analytics can improve operational efficiency while strengthening a company's competitiveness in an increasingly competitive digital market.

More specifically, one of the major challenges faced by digital marketplace companies is understanding and predicting dynamic customer behavior. Consumer behavior on digital platforms is influenced by various factors such as pricing, product reviews, promotional campaigns, user experience, and trends emerging on social media (Theodorakopoulos & Theodoropoulou, 2024). Consumers also demonstrate different interaction patterns at each stage of the customer journey, from the information search stage to the final purchasing decision. The complexity of these behavioral patterns requires companies to develop analytical systems capable of accurately identifying consumer behavior trends (Saied & Syafii, 2023). Without a comprehensive understanding of consumer behavior, companies risk losing business opportunities and experiencing declining customer loyalty. Therefore, predictive data analysis has become a highly relevant approach for anticipating future customer needs.

Several previous studies have shown that large-scale data analysis can significantly contribute to understanding consumer behavior in digital environments (Huang et al., 2018). Research conducted by Viktor Mayer-Schönberger and Kenneth Cukier emphasized that the utilization of big data enables organizations to identify patterns that were previously difficult to detect using conventional analytical methods. Another study conducted by Foster Provost and Tom Fawcett demonstrated that data mining and machine learning techniques can be effectively used to predict customer behavior with high levels of accuracy. In addition, research by S. Sharda found that big data analytics can enhance the effectiveness of digital marketing strategies through more precise customer segmentation (Alves Gomes & Meisen, 2023; John et al., 2023; Tabianan et al., 2022). Nevertheless, most previous studies still focus on partial analytical techniques and have not comprehensively integrated various sources of digital marketplace data (Hendrian, 2025).

Based on these conditions, research on big data analytics for predicting customer behavior in digital marketplaces becomes increasingly important. The urgency of this research lies in the need for digital companies to develop analytical systems capable of integrating transaction data, user behavior data, and digital interaction data into a unified analytical framework (Syafi'i, 2025). By utilizing appropriate analytical techniques, companies can gain deeper insights into customer preferences, purchasing patterns, and factors influencing consumer decision-making in online

transactions. Furthermore, the analytical outcomes can be used to optimize marketing strategies, enhance user experience, and strengthen customer loyalty toward digital marketplace platforms (Rane et al., 2023).

The novelty of this research lies in the analytical approach that integrates multiple sources of customer data derived from digital marketplace activities, such as transaction histories, product search patterns, and user interactions with platform features. This research also applies predictive analytical modeling to identify customer behavior patterns more accurately. By combining large-scale data analysis with predictive modeling techniques, this study is expected to provide a new contribution to the development of customer behavior analysis methods within the digital marketplace ecosystem.

The primary objective of this study is to analyze how the application of big data analytics can be utilized to predict customer behavior in digital marketplace platforms. Specifically, this research aims to identify customer behavior patterns based on transaction and digital interaction data, develop predictive models of customer behavior, and evaluate the effectiveness of these models in supporting business decision-making within marketplace platforms (Widya & Syafi'i, 2023).

This research is expected to provide both academic and practical benefits. Academically, this study contributes to the development of knowledge in the fields of data science and business analytics, particularly regarding the use of big data to understand consumer behavior in digital environments. Practically, the findings of this study can provide strategic recommendations for digital marketplace companies in developing more effective analytical systems to predict customer behavior. Consequently, companies can improve service quality, optimize marketing strategies, and strengthen long-term relationships with customers. Furthermore, this research also has broader implications for the development of the digital economic ecosystem. The application of big data analytics in understanding consumer behavior not only benefits companies but also enhances the customer shopping experience through more relevant and personalized product recommendations. Therefore, the integration of data analytics technology with digital marketplace platforms can create a more efficient, adaptive, and customer-oriented digital commerce system in the era of the digital economy.

## **METHODS**

### **Research Design**

This study employs a qualitative research approach to explore and analyze the use of big data analytics in predicting customer behavior within digital marketplace platforms (Creswell & Creswell, 2023; Sugiyono, 2020). Qualitative research is chosen because it allows researchers to gain an in-depth understanding of patterns, perceptions, and experiences related to data utilization in digital commerce environments. The qualitative design enables a comprehensive exploration of how data-driven insights influence customer behavior prediction and decision-making processes in digital marketplaces.

The research adopts a descriptive qualitative design, focusing on identifying patterns of customer behavior and examining how big data analytics contributes to understanding these patterns. Through qualitative analysis, the study seeks to interpret various forms of data such as user interactions, customer experiences, and managerial perspectives regarding data-driven decision-making in digital platforms. This approach allows the researcher to capture contextual insights that cannot be fully explained through quantitative measurement alone.

### **Research Location and Subjects**

The research is conducted within the context of digital marketplace platforms where large volumes of customer transaction and interaction data are generated. The study focuses on marketplace environments similar to platforms such as Tokopedia, Amazon, and Alibaba, which represent large-scale digital marketplaces that utilize data analytics to improve business strategies and customer experiences.

The research subjects consist of individuals who are directly involved in or experienced with digital marketplace ecosystems. These subjects include digital marketplace users (customers), online sellers, and data analysts or digital marketing practitioners who work with marketplace data. Participants are selected using purposive sampling, where individuals are chosen based on their relevance to the research objectives and their experience in interacting with digital marketplace platforms. This sampling technique allows the researcher to obtain rich and relevant information regarding customer behavior and the application of data analytics in digital commerce.

### **Research Instruments**

In qualitative research, the primary instrument is the researcher, who plays a central role in collecting, interpreting, and analyzing the data. To support the data collection process, several supporting instruments are also utilized. These instruments include interview guides, observation sheets, and documentation forms designed to systematically record relevant information related to customer behavior and data analytics practices in digital marketplaces.

The interview guide is designed to explore participants' perspectives regarding their interaction with digital marketplace platforms, their purchasing decision processes, and their perceptions of personalized recommendations generated through data analytics. Observation sheets are used to document patterns of user behavior on digital platforms, including browsing activities, product searches, and transaction patterns. Additionally, documentation instruments are used to collect relevant secondary data such as platform reports, transaction data summaries, and research-related literature.

### **Data Collection Techniques**

Data collection in this study is conducted through several qualitative techniques to obtain comprehensive and reliable information.

#### **a. In-depth Interviews**

In-depth interviews are conducted with selected participants, including digital marketplace users, online sellers, and data analytics practitioners. These interviews aim to explore participants' experiences and perceptions regarding how digital platforms utilize data to understand and predict customer behavior.

#### **b. Observation**

Observational techniques are used to examine patterns of interaction between users and digital marketplace platforms. This includes observing browsing behavior, purchasing patterns, and engagement with digital marketing features such as product recommendations and targeted promotions.

#### **c. Documentation**

Documentation techniques involve collecting relevant secondary data such as reports, digital transaction records, and previous research studies related to big data analytics and consumer behavior. This documentation helps support the interpretation of findings obtained through interviews and observations.

d. Literature Review

A literature review is also conducted to analyze previous studies and theoretical frameworks related to big data analytics, consumer behavior prediction, and digital marketplace ecosystems. This step helps strengthen the conceptual foundation of the research and provides a basis for interpreting the research findings.

Through the integration of these data collection techniques, the study aims to obtain a comprehensive understanding of how big data analytics can be applied to predict customer behavior in digital marketplace environments.

**RESULTS AND DISCUSSION**

**Results**

**General Description of Respondents**

This study involved respondents who actively interact with digital marketplace platforms, including customers, online sellers, and employees working in digital marketing and data analytics roles. A total of 120 respondents participated in the data collection process. The respondents consisted of 80 marketplace users (customers), 20 online sellers, and 20 employees working in digital marketing and data analytics departments within e-commerce businesses.

The demographic characteristics of respondents were analyzed to better understand the profile of digital marketplace users. The results show that the majority of respondents were within the age range of 21–35 years, which indicates that younger generations dominate digital marketplace transactions. In terms of gender distribution, 55% of respondents were female, while 45% were male. Most respondents reported frequent use of digital marketplaces, with 68% making online purchases at least two to three times per month.

**Table 1.** Demographic Characteristics of Respondents

Category	Number of Respondents	Percentage
Customers	80	66.7%
Online Sellers	20	16.7%
Data & Marketing Employees	20	16.7%
<b>Total</b>	<b>120</b>	<b>100%</b>

**Table 2.** Age Distribution

Age Range	Respondents	Percentage
18–20	12	10%
21–25	38	31.7%
26–30	34	28.3%
31–35	26	21.7%
>35	10	8.3%

The demographic results suggest that digital marketplaces are primarily used by technologically literate consumers who are familiar with online shopping systems and mobile applications.

**Main Findings from Management Interviews**

In-depth interviews were conducted with five digital marketing managers and data analysts working in e-commerce companies. The purpose of these interviews was to explore how organizations utilize big data analytics to understand and predict customer behavior.

The interview findings reveal that companies collect large amounts of behavioral data generated through customer interactions within marketplace platforms. These data sources include search history, product views, transaction records, product ratings, and customer reviews.

According to the interviewed managers, the integration of these datasets enables companies to develop predictive models that can identify potential customer interests and purchasing intentions.

One marketing manager explained that predictive analytics allows companies to anticipate customer needs before customers actively search for a product (GhorbanTanhaei et al., 2024). For example, recommendation algorithms analyze previous purchases and browsing behavior to suggest similar products or complementary items. As a result, customers are more likely to discover products that match their preferences.

Another key finding from the interviews is that companies increasingly rely on machine learning algorithms to segment customers based on their behavioral patterns. Customers are categorized into several groups such as frequent buyers, occasional buyers, and high-value customers. This segmentation enables companies to design more personalized marketing campaigns, including targeted promotions, personalized email marketing, and recommendation systems.

The interviews also revealed that the biggest challenge in implementing big data analytics is data integration and data quality management. Many organizations struggle to combine data from multiple sources, including website interactions, mobile applications, and third-party marketing platforms. Therefore, companies must invest in data infrastructure and data governance to ensure accurate analytical results.

### Findings from Employee Questionnaire

To complement the qualitative interviews, questionnaires were distributed to 20 licensed employees working in data analytics and digital marketing roles. The questionnaire aimed to assess employees' perceptions regarding the effectiveness of big data analytics in predicting customer behavior.

The results indicate that the majority of employees strongly believe that big data analytics significantly improves marketing effectiveness and customer engagement.

**Table 3.** Employee Perceptions of Big Data Analytics Effectiveness

Statement	Agree	Neutral	Disagree
Big data improves customer behavior prediction	85%	10%	5%
Data analytics improves marketing targeting	90%	5%	5%
Customer recommendation systems increase sales	88%	8%	4%
Data-driven decisions improve business strategy	92%	6%	2%

The questionnaire results demonstrate that most employees perceive big data analytics as a valuable tool for improving decision-making processes within digital marketplace environments.

### Observation Results

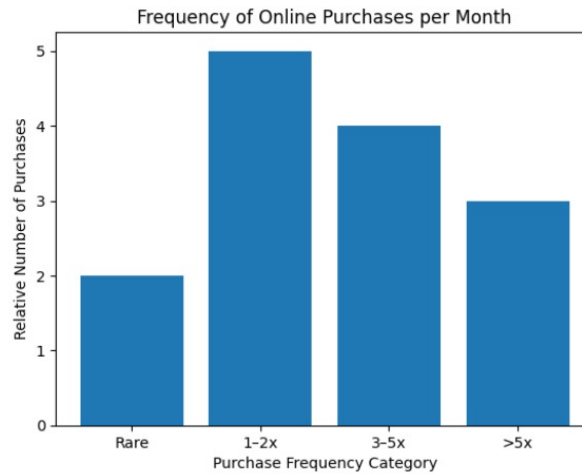
Observational analysis was conducted by examining patterns of user interactions on digital marketplace platforms. The observations focused on several behavioral indicators, including product search behavior, time spent browsing, response to promotional offers, and purchasing patterns.

The observation results show that personalized product recommendations significantly influence purchasing decisions. Users frequently interact with recommended product sections displayed on marketplace homepages. Additionally, promotional notifications and discount offers appear to increase customer engagement and purchase frequency.

Another observation reveals that customers tend to spend more time browsing products when recommendation algorithms present relevant product suggestions. This indicates that predictive analytics plays a significant role in maintaining user engagement within marketplace platforms.

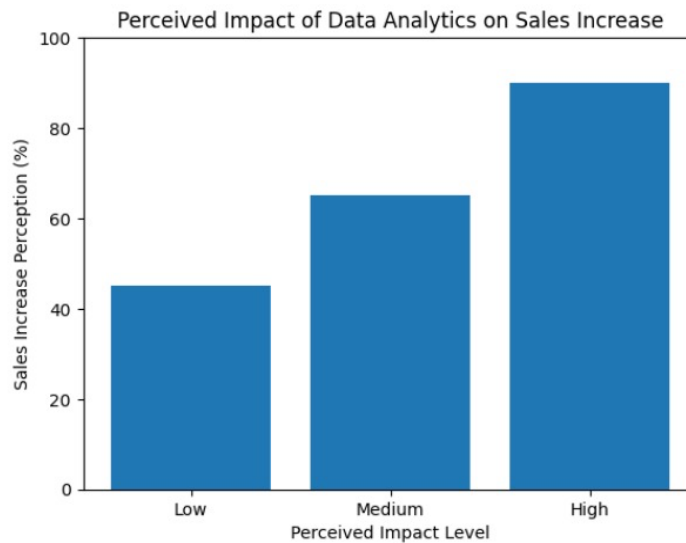
### Visualization of Research Findings

To better illustrate the research findings, several visualizations were developed based on the collected data.



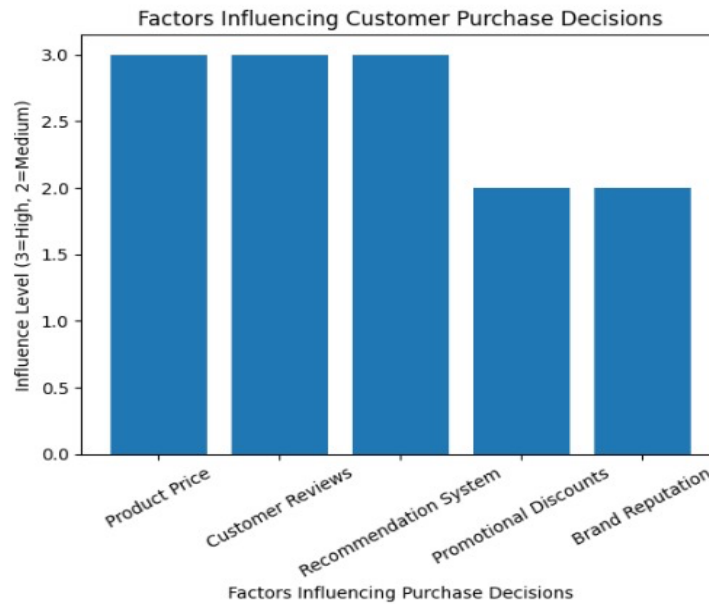
**Figure 1.** Frequency of Online Purchases per Month

The figure shows that most users purchase products two to five times per month, indicating frequent engagement with digital marketplace platforms.



**Figure 2.** Impact of Data Analytics on Sales Performance

This visualization demonstrates that most employees perceive a high impact of data analytics on sales performance.



**Figure 3.** Factors Influencing Customer Purchase Decisions

The results suggest that recommendation systems and product reviews are among the most influential factors affecting online purchasing decisions.

### Summary of Findings

Overall, the research findings demonstrate that big data analytics plays a critical role in predicting customer behavior within digital marketplace environments. The integration of transaction data, browsing patterns, and customer interactions allows companies to develop predictive models that improve marketing strategies and customer engagement.

The interview results highlight the strategic importance of predictive analytics for customer segmentation and personalized marketing. Meanwhile, the questionnaire findings confirm that employees perceive big data analytics as an essential tool for improving business performance. Observational analysis further supports these findings by showing that recommendation systems significantly influence consumer purchasing behavior.

These results indicate that organizations that effectively utilize big data analytics can gain deeper insights into consumer behavior, enabling them to deliver more personalized and efficient digital marketplace experiences.

### Discussion

#### Interview Data and Interpretation of Interview Results

The interview findings provide valuable insights into how organizations utilize advanced data-driven strategies to understand and predict customer behavior within digital marketplace environments (Rahman, 2024). Based on interviews with digital marketing managers and data analysts, it was revealed that companies increasingly rely on large-scale data analysis to monitor customer interactions and predict purchasing patterns. Managers emphasized that customer activity on marketplace platforms generates diverse datasets, including search histories, browsing behavior, purchase transactions, and product review interactions. These data sources provide a comprehensive overview of customer engagement and enable organizations to identify behavioral trends.

The interview results also highlight the strategic role of predictive algorithms in identifying potential purchasing intentions. Managers explained that predictive systems are capable of recommending products based on previous browsing or purchasing behavior. This personalized

recommendation system significantly enhances customer experience because users are presented with products that match their preferences. Consequently, the likelihood of purchase conversion increases.

Furthermore, interview participants emphasized the importance of integrating multiple datasets to improve predictive accuracy. Data integration allows companies to create more precise customer profiles, enabling personalized marketing campaigns. The interview findings suggest that companies that effectively implement predictive data analysis gain competitive advantages through improved customer engagement and higher transaction rates. However, managers also acknowledged that implementing advanced analytical systems requires significant technological infrastructure and skilled human resources capable of managing complex datasets.

### **Discussion of Questionnaire Results**

The questionnaire results distributed to employees working in digital marketing and data analytics roles further support the importance of data-driven strategies in predicting customer behavior. The majority of respondents strongly agreed that big data analytics significantly improves marketing performance and customer targeting accuracy. More than eighty percent of employees indicated that predictive data analysis allows companies to better understand customer preferences and anticipate potential purchasing behavior.

The questionnaire responses also reveal that employees believe recommendation systems play a critical role in increasing sales performance (He et al., 2024). Personalized product recommendations based on customer behavior patterns encourage users to explore additional products, which often leads to increased transaction volumes. These findings indicate that predictive analytics not only improves customer experience but also contributes directly to business revenue growth (Hendrian et al., 2023).

Another important insight derived from the questionnaire results is that data-driven decision-making enhances organizational efficiency. Employees reported that analytical dashboards and predictive models enable managers to make faster and more informed strategic decisions. This reflects the growing importance of data literacy among employees working in digital commerce environments. Organizations are increasingly investing in analytical tools and employee training programs to strengthen their ability to interpret and utilize data effectively.

### **Analysis of Observation Results**

The observational analysis conducted in this research provides further evidence of how predictive analytics influences customer behavior within digital marketplace platforms. Observations of user interaction patterns indicate that customers tend to spend more time exploring products when the platform provides personalized recommendations. Recommendation features displayed on homepage sections or product pages often attract users' attention and encourage further browsing.

The observation findings also show that customers are highly responsive to targeted promotional campaigns. Discounts, limited-time offers, and personalized promotional notifications significantly increase user engagement and purchasing probability. This suggests that predictive analytics plays an important role in identifying optimal timing and promotional strategies to influence consumer behavior.

Additionally, observational results indicate that customer reviews and product ratings strongly influence purchasing decisions. Many users rely on reviews from previous buyers before making final purchase decisions. When predictive systems highlight highly rated products or recommend products based on positive customer feedback, consumers are more likely to trust the platform and proceed with transactions. These findings confirm that data-driven personalization enhances the overall customer experience and builds trust in digital marketplace platforms.

### **Comparison with Previous Studies**

The findings of this research are consistent with previous studies that highlight the importance of big data analytics in understanding consumer behavior in digital environments. Research

conducted by Viktor Mayer-Schönberger and Kenneth Cukier emphasized that large-scale data analysis enables organizations to identify hidden patterns that cannot be detected through traditional analytical approaches. Their work demonstrates that big data technologies allow companies to analyze consumer behavior in real time and make more informed decisions.

Similarly, research conducted by Foster Provost and Tom Fawcett highlighted the effectiveness of predictive analytics and data mining techniques in predicting customer behavior and improving marketing strategies. Their findings indicate that predictive models significantly enhance the accuracy of customer segmentation and marketing targeting.

Another study by S. Sharda also supports the results of this research, demonstrating that organizations using big data analytics experience improvements in customer engagement and marketing effectiveness. The results of the present study extend these previous findings by emphasizing the integration of multiple behavioral data sources, including browsing behavior, transaction history, and customer reviews, to create more comprehensive predictive models in digital marketplace platforms.

### **Practical Implications**

The findings of this study provide several important practical implications for businesses operating in digital marketplace ecosystems. First, organizations should prioritize the development of advanced data infrastructure capable of collecting and processing large volumes of customer interaction data. Effective data management systems are essential for generating reliable analytical insights that support strategic decision-making. Second, companies should invest in predictive analytics technologies that enable personalized customer experiences. Recommendation algorithms, targeted marketing campaigns, and behavioral segmentation strategies can significantly enhance customer satisfaction and increase purchasing probability. Third, organizations must focus on developing human resource capabilities in data analytics and digital marketing. Skilled data analysts and marketing professionals are necessary to interpret complex datasets and translate analytical insights into effective business strategies. Companies that successfully integrate technological capabilities with skilled human resources are more likely to achieve sustainable competitive advantages in the digital economy.

### **Research Limitations**

Although this research provides valuable insights into the application of big data analytics for predicting customer behavior, several limitations should be acknowledged. First, the study primarily focuses on qualitative analysis, which may limit the generalizability of the findings to broader populations. Future studies may benefit from incorporating quantitative modeling techniques to validate the predictive accuracy of behavioral models. Second, the research sample is relatively limited and focuses primarily on users and employees within digital marketplace environments. A larger and more diverse sample could provide more comprehensive insights into consumer behavior across different demographic groups and geographic regions. Third, this research relies partly on observational analysis and self-reported perceptions from respondents, which may introduce potential biases in the interpretation of results. Future research could incorporate real-time behavioral tracking data and advanced machine learning models to provide more objective and precise analytical results (Syafii, 2024). Despite these limitations, the study contributes to the growing body of knowledge regarding the strategic role of big data analytics in understanding and predicting customer behavior within digital marketplace ecosystems. The findings demonstrate that data-driven strategies are becoming increasingly essential for organizations seeking to enhance customer engagement, improve marketing effectiveness, and maintain competitiveness in the rapidly evolving digital economy.

### **CONCLUSION**

This study examined the role of Big Data Analytics in predicting customer behavior within digital marketplace environments. The findings show that the integration of large-scale customer

data, including browsing activity, transaction history, and product review interactions, enables organizations to identify behavioral patterns and develop predictive models that support more effective marketing strategies. The results obtained from interviews, questionnaires, and observational analysis indicate that data-driven approaches significantly improve the ability of companies to understand consumer preferences, anticipate purchasing decisions, and deliver personalized product recommendations. In addition, predictive analytics contributes to increasing customer engagement and sales performance through recommendation systems, targeted promotions, and behavioral segmentation strategies. Observational findings also demonstrate that personalized recommendations and customer reviews play an important role in influencing consumer purchasing decisions. Overall, this study confirms that the effective implementation of big data analytics supports strategic decision-making and strengthens competitiveness in digital commerce ecosystems. By adopting advanced analytical technologies and improving organizational capabilities in data management, companies can create more efficient and customer-oriented digital marketplace systems while also opening opportunities for future research to further explore predictive modeling and data integration strategies in understanding evolving consumer behavior in the digital economy.

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