

The algorithmic consumer: A conceptual investigation of AI's influence on consumer preferences and decisions

Annur Islam Sifat

Raj Soin College of Business, Wright State University, Dayton, Ohio 45435, United States of America

Article History

Received: 2025-01-24 Revised: 2025-05-29 Accepted: 2025-06-02 Published: 2025-08-22

Keywords:

Artificial intelligence in marketing; consumer decision-making; algorithmic personalization; ethical AI Use; digital consumer behavior.

*Corresponding author:

sifat_175@yahoo.com sifat.2@wright.edu

DOI:

10.20885/AMBR.vol5.iss2.art14

Abstract

Artificial intelligence (AI) is changing the landscape of consumer behaviour in how preferences develop, decisions form, and engagement via marketing occurs. This conceptual paper explores 89 reports, articles, and case studies to analyze the algorithmic consumer, examining the multifaceted impact of AI on consumer preferences and decision-making. By a thorough literature review and commentary, I critically analyzed the impact of AI's personalization algorithm and addressed ethical implications in terms of potential bias, data privacy, and transparency. This paper establishes a conceptual framework to illustrate how AI technologies, including machine learning, natural language processing, and predictive analytics, intersect with facets of consumer psychology, allowing for personalization of experiences, market segmentation, and influencing behaviour in real time. While AI offers marketers tools to enhance targeting and engagement constructively, AI presents significant ethical implications around autonomy, manipulation, and equity. Therefore, recommendations for transparency, accountability, and ethical considerations of AI applications and frameworks for marketers using AI were also presented. This paper contributes to dynamic discourse around how to responsibly approach AI to influence consumer engagement by providing both a theoretical framework for future empirical study as well as a strategic direction for marketers, developers, and policymakers. Ultimately, this paper insists on a sensible balance between maximizing the potential of AI to shape markets and consumer engagement and the need for consumer trust and well-being.

Introduction

The shift of artificial intelligence in impacting consumer behavior has redefined consumer views, engagement with, and choice of products and services (Yazdani & Darbani, 2023). This shift calls for elaborate theorizing on the relationship of AI technologies to the cognitive processes that inform consumer decision making (Gonçalves et al., 2023). In the digital age, AI-enabled devices and services are now a standard part of the consumer experience, creating a non-linear departure from traditional consumer interaction and expectations (Guerra-Tamez et al., 2024). The AI-asconsumer-agent role requires a multi-faceted understanding of AI's influence on consumer choices and preferences (Balakrishnan & Dwivedi, 2021; Guerra-Tamez et al., 2024). This conceptual paper seeks to examine the considerable relationship between AI and consumer behavior and unpack the processes of how the AI-enabled system(s) affect consumer perceptions, preferences, and purchasing behaviors (Guerra-Tamez et al., 2024). Furthermore, this paper will provide a theoretical framework in terms of how AI-as-technology is shaping consumer behavior through a

nuanced understanding of modalities through which AI technologies bring about changes in consumer actions or behaviors.

AI technologies, encompassing machine learning algorithms, natural language processing, predictive analytics, and data-driven decision-making, have revolutionized marketing strategies and consumer engagement (Tadimarri et al., 2024). AI is not merely a technological tool but an active agent that shapes consumer behavior (Bai, 2022). Recent research has focused on the intersection of AI and marketing, underlining the significance of exploring AI-related topics and their functions in marketing (Vlačić et al., 2021). This paper will explore how AI can change the core of marketing by emphasizing a great variety of AI applications that qualify this relationship (Kumar, Bapat et al., 2024; Venkatesan & Lecinski, 2021). Through a comprehensive review of existing literature and theoretical frameworks, this paper seeks to unravel the intricate pathways through which AI influences consumer behavior, offering insights into the ethical, societal, and economic implications of this technological revolution.

AI-Driven Personalization and Preference Formation

Today, in modern marketing, AI-powered personalization is taking center stage. With the advancement of AI, customer management and product personalization have been transformed altogether (Kumar et al., 2019). By analyzing vast volumes of data like demographics, browsing habits, purchasing behaviors, and social media inclinations, AI enables marketers to develop personalized experiences that highlight consumer desires and essentials (Kumar, Bapat et al., 2024). Apart from product recommendations, personalization has been applied to content, ad targeting, price, and interactions (Singh, 2024). AI capabilities aid companies to produce and display ads, choose target consumers, and analyze user behavior to improve campaign performance (Zaman, 2022). As AI keeps evolving, it will uncover implicit patterns and deeper connections in data, making feedback increasingly personalized.

Despite this, hyper-personalization comes with ethical concerns related to data privacy, algorithmic bias, and manipulation (Beyari & Hashem, 2025). Consumers are intimidated by echo chambers that reinforce their existing beliefs and limit exposure to alternative perspectives. Marketers must establish trust through transparent data and explainable algorithmic decisions (Kumar & Suthar, 2024). Personal marketing is also controversial when it comes to infringement of privacy and discrimination (Wilson et al., 2024). As much as AI can anticipate and react to the needs of the consumer has transformed marketing (Zulaikha et al., 2020; Tiautrakul & Jindakul, 2019), it needs to supplement—but not replace—human intuition. A balance between AI and human-to-human interaction is crucial in gaining and retaining consumer trust (Janowski, 2025).

Artificial intelligence (AI) algorithms can track human behavior over time and replicate it by segmenting customers, thereby enabling marketers to communicate more effectively with their audience (Zulaikha et al., 2020). Processing large volumes of behavioral data, AI identifies trends and offers timely, personalized propositions and prices (Beyari & Hashem, 2025). This enhances the targeting abilities of marketers and enables them to sustain customer relationships (Zaman, 2022). With the development of artificial intelligence, its impact on consumer purchase decisions and purchasing behavior will also grow. Customized promotion, made possible through real-time tools like virtual assistants and chatbots, offers instant assistance and suggestions to ensure higher ROI. As consumers become more comfortable with these technologies, their influence on behavior will intensify. Firms that recognize and strategically apply AI are better positioned to thrive in the digital marketplace. Through machine learning and data-driven insights, AI aids in understanding market dynamics, influencing trends, and enabling highly tailored market segmentation (Mirwan et al., 2023).

However, AI-based personalization also raises ethical issues about consumer autonomy and algorithmic manipulation. While AI may mimic and personalize consumer actions, it can also shape preferences in subtle, sinister ways. This blurs the line between autonomous decision and algorithmic influence. With more sophisticated AI tools, marketers must weigh their ethical responsibility to enable consumers to have meaningful agency over decisions separate from unobvious influence. With AI integrated into marketing, we have entered a new era of

personalization as brands increasingly rely on consumer influence (Madanchian, 2024; Hermann & Puntoni, 2024). AI can analyze large swathes of consumer data and provide personalization as a corporate strategy (Priyanka et al., 2023; Campbell et al., 2019; Gkikas & Theodoridis, 2021; Tiautrakul & Jindakul, 2019).

Algorithmic Bias and Ethical Considerations

As AI algorithms become more common in marketing-related decision-making, marketing researchers need to consider the possible risk of algorithmic bias. AI algorithms make decisions based on data, and if the data used is already biased, as societal data is, the biased data could be transferred to the algorithm (Sharma & Sharma, 2023). The potential for the marketer to produce discriminatory outcomes is substantial - it could be targeted advertising that reinforces stereotypes or a pricing algorithm that identifies factors that disadvantage a target demographic (Sharma & Sharma, 2023). Algorithmic bias can occur in multiple forms, including biased data, biased algorithmic state, and/or biased interpretation of the results (Sharma & Sharma, 2023).

The importance is to create and apply AI algorithms in a fair and just manner, which means that an evaluation of the possibility for the unintended outcomes of these applications will require careful consideration (Kumar & Suthar, 2024). Marketing researchers need to recognize the possibility of algorithmic bias, and additionally, as part of recognizing it, they need to explore means for mitigation. AI is powerful but operates in a black box system where there may be little transparency for the rationale of decisions, or that it would significantly contribute to an unknowingly unethical application of the AI tool (Koswara & Herlina, 2025).

Ethical frameworks and guidelines can help mitigate these challenges and allow for a responsible and ethically informed use of AI technology within marketing (Kumar & Suthar, 2024; Mohamed et al., 2024). As companies try to develop and apply AI strategies in marketing practices, they should consider ethical challenges, such as fairness, transparency, and accountability (Kumar & Suthar, 2024). Companies will also need to be aware of legal and regulatory challenges associated with AI marketing issues, including data protection laws and consumer protection laws (Kumar & Suthar, 2024). Ethical challenges can also include explainability, privacy, and trust (Hermann, 2021).

There is a range of ethical challenges that make using AI in marketing complicated, so a multi-stakeholder approach to addressing some of the ethical challenges around technical systems like AI in marketing is required (Hermann, 2021). A multi-stakeholder approach involves all players in the marketing ecosystem, including marketers, policymakers, consumers, and technology developers. They can collectively help establish ethical standards and guidelines to promote the ethical use of AI in marketing (Hermann, 2021). Dialogue and collaboration will help to ensure we can use AI to benefit businesses and consumers while considering the rights of all participants in an ethically aligned manner. Engaging in meaningfulness to address algorithmic bias, transparency is essential because it is one step in creating confidence and fostering a more equal and equitable marketplace. The development of artificial intelligence, with machine learning, has become a disruptive key technology in digital marketing, signaling a need to make data-driven marketing decisions (Spais & Chryssochoidis, 2025). The implementation of AI has prompted many questions relating to privacy, security, and manipulation (Kumar, Bapat et al., 2024).

The importance of organizations taking proactive steps to protect consumer privacy and acting responsibly with AI could not be more vital (Wilson et al., 2024). This might involve creating solid data protection protocols, then having reasonable spatial data with information that shows consumers how algorithms underpin the AI, but giving consumers more control over their data and how it can be (ab)used (Grewal, Guha, et al., 2024; Kumar & Suthar, 2024).

Currently, AI informs nearly all marketing behaviors and generally affords improved measurable outcomes (Shaik, 2023). Ultimately, the ethics of AI with marketing exist through its transactions, and hence the overarching social mores and values that shape them (Hermann, 2021). We also need an organizational culture that can sustain ethical accountability, enabling organizations to encourage continuous learning and prevent new ethical dilemmas from developing within the AI context (Maiti et al., 2025). The black-box nature of AI models can make it difficult

to understand how they arrive at their decisions, potentially leading to unintended biases or discriminatory outcomes (Bruyn et al., 2020).

Moreover, the opacity in AI algorithms can diminish consumer trust, as many users may hesitate to invest in systems they are unfamiliar with. Ethical issues involved with AI include data privacy, algorithmic bias, and the risk of deceptive marketing. A significant emphasis must be placed on the ethical implications and great scrutiny over how AI marketing systems are influencing e-commerce sales metrics (Madanchian, 2024). Ethical guidelines need to ensure that AI is deployed in a way that abides by human values, leverages fairness, and does not cause harm.

Literature Review

The increasing use of AI in marketing requires a detailed assessment of the literature to track the implications for consumers, businesses, and ethics (Alhitmi et al., 2024; Gündüzyeli, 2024). This literature review looked at existing literature to provide an analysis of the extant literature on AI and marketing. Madanchian (2024) studied AI in the associated domains of marketing generally, consumer research, psychology, and technology adoption (Ameen et al., 2022). This literature review covers several topics, including AI-driven personalization, algorithmic biases, consumer trust, and AI in marketing ethics issues.

A systematic literature review is conducted to assess articles written on AI-powered marketing and literature regarding AI-marketing practices to evaluate their coverage, impact, relevance, and established guidance while interpreting the findings by sector, research context, and situations (Chintalapati & Pandey, 2021). This review enables the identification of some research gaps, captures key trends, and provides direction for future studies (Huang & Rust, 2020). The review aims to assess and evaluate the current understanding of the key influence of AI on consumer preference and decision-making. Additionally, it is an opportunity to uncover the challenges and opportunities for this changing technology.

The increasing relevance of AI in marketing has produced greater interest from scholars and practitioners alike (Verma et al., 2021). There are theoretical and practical paradigms to consider for understanding AI in marketing, as well as issues of ethics and society. A complete review of the literature is an important step in determining key themes, research gaps, and emerging trends on the subject. Studying the ethics and societal issues of AI marketing is increasingly necessary due to the utilization of algorithms that can replicate bias, increase the manipulation of consumers, and degrade trust.

AI enables marketing strategies that are based on data about consumers. AI tools can read consumer behavior and structure marketing strategies based on the insights (Nesterenko & Олефіренко, 2023). It is imperative to consider ethics when considering AI and its applications in marketing. Using references to ethical principles with AI will also focus you on relevant areas for application. There has also been much work indicating the necessity of analyzing the usefulness of AI to marketing decision-making (Venkatesan & Lecinski, 2021).

The use of AI in marketing is primarily based on the website type and business type (Haleem et al., 2022). The objective of this review is to identify the extent to which AI is being used in marketing (Haleem et al., 2022). The unsummarized topics considered in this review regarding the use of AI in marketing advocacy indicate that there is continued capitalist marketing effectiveness. The review highlights the use of AI in advertising, customer service, content creation, and market research (Campbell et al., 2019; Vlačić et al., 2021). These examples illustrate the tangible effects of AI in marketing and why it could result in a paradigm shift in terms of business practices (Campbell et al., 2019).

Algorithmic Influence on Consumer Preferences

AI-driven algorithms have changed the way companies understand and interact with consumers. These algorithms take data and turn it into analysis to produce forecasts of consumer behavior, to customize marketing messages, and optimize pricing strategy (Zulaikha et al., 2020). The algorithms assess customer behavior, which allows businesses to gain knowledge on customer tastes and habits

(Priyanka et al., 2023). They allow businesses to develop strategies that reflect customer preferences (Alghizzawi et al., 2024). However, this raises important questions about algorithms' impact on consumer preferences and decisions (Nassar, 2024).

If marketers know how the algorithms influence consumer behavior, then they can create more effective and ethical approaches that benefit both the business and the consumer alike. It is helpful to understand how much algorithms influence consumer preferences and decisions. Personalized recommendations, targeted advertising, and dynamic pricing are all ways through which AI algorithms can shape consumer behavior. Algorithmic discrimination can also reinforce existing social inequalities, producing discriminatory results for some groups of consumers (Kumar & Suthar, 2024).

AI algorithms can find patterns in large datasets. This makes marketing more efficient and focused (Venkatesan & Lecinski, 2021). In today's digital economy, personalized recommendations, advertisements, and pricing are common (Grewal, Guha, et al., 2024). Customization can improve customer satisfaction and loyalty. However, it raises concerns about privacy and manipulation. The success of AI personalization depends mainly on the quality and completeness of the training data. Research on recommendation systems shows how AI affects consumer perception and attitude. It highlights issues like cognitive bias, framing effects, and social influence. Algorithms carry values, as they are designed to influence consumers.

Understanding the internal dynamics and behavioral impact of these systems is crucial for creating fair policies that protect consumers from manipulation and discrimination. As marketing becomes more central, consumer freedom and autonomy in decision-making are at risk (Yue-jiao & Liu, 2022). AI can create "echo chambers" that reinforce favored views, limit exposure to opposing perspectives, and sway consumer perceptions of goods and brands.

Conceptual Framework

This conceptual assessment takes a broad approach, with a literature review, conceptual analysis, and ethical reasoning. A similar conceptual study has previously documented the historical convergence of the two research fields. The literature review includes a fully auditable search of academic databases, industry reports, and other relevant literature to uncover information about AI, consumer behavior, and marketing theory (Vlačić et al., 2021). The literature search will pull information from multiple disciplines, including marketing, psychology, computer science, and ethics, which we believe will provide an organic foundation for exploring the subject. The methodology we will use is based closely on previous qualitative study designs, highlighting the credibility of qualitative methods in studying social and ethical occurrences (Koswara & Herlina, 2025).

This project includes a conceptual analysis to deconstruct and review critical concepts surrounding AI and consumer decision-making, such as algorithmic bias, personalization, and autonomy. The sources will consist of scholarly articles, books, and conference proceedings that consider the research questions. Articles will be searched using ABI/Inform, Scopus, Web of Science, and Google Scholar. Ethical reasoning is used to discuss the ethical considerations involved in AI-driven marketing, considering many ethical frameworks and principles to assess the potential impact of AI on consumer welfare, autonomy, and fairness (Hermann, 2021).

The methodology and methodological approaches to the project also involve case studies and examples to demonstrate the implications of AI for marketers in practice. The data analysis looks for common themes, patterns, and contradictions in the literature, and develops a conceptual framework to make sense of the relationship between AI and consumer behavior. I also want the project to guide researchers, marketers, and policymakers trying to understand and deal with the challenges and opportunities concerning AI in marketing (Ma & Sun, 2020; Huang & Rust, 2020). Attention is paid to words likely to build the theoretical basis of consumer responses to AI-produced marketing communications, which will help marketers wisely develop their next steps in this new area (Kirk & Givi, 2024).

To build knowledge about how AI shapes consumer preferences and decisions, all ethical and social implications should be considered. The goal is to provide an original, theoretically

grounded framework that can serve as a basis for future research in this area. The research is developed to contribute to current discussions concerning AI's contribution to society and help provide a framework for responsible and ethical AI use in marketing (Giarmoleo et al., 2024).

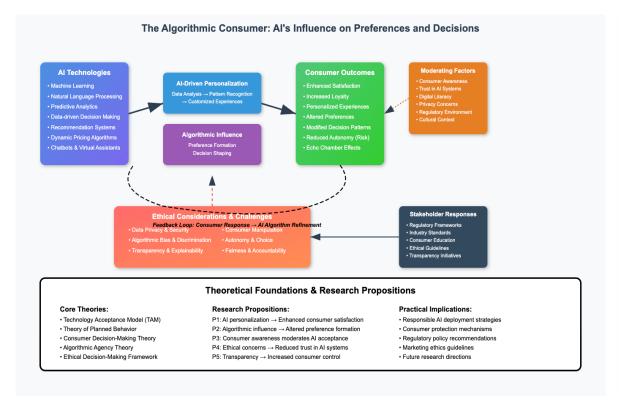


Figure 1. Conceptual Framework

Based on the literature review and the conceptual methodology employed, Figure 1 presents the proposed conceptual framework for understanding how AI influences consumer preferences and decision-making.

AI-Driven Personalization: Shaping Individual Consumer Experiences

AI-powered personalized marketing has become a compelling way for marketers to personalize their products and communication toward individual consumers (Hermann, 2021). The goal of AI-powered personalization is to create personalized content and personalized interactions that increase consumer purchase likelihood (Chandrakumar, 2024). AI algorithms allow the processing of large quantities of data, enabling consumers to identify patterns and predict how they will behave, which in turn allows marketers to deliver highly relevant personalized experiences (Singh, 2024). To harness AI systems for personalized marketing communication, ethical considerations surrounding data collection and use will need to be addressed to avoid harm and to maintain consumer trust in AI-generated, personalized marketing (Hemker et al., 2021).

AI algorithms analyze all the digital footprints consumers generate, such as their browsing histories, purchase histories, and social media activity, to generate detailed profiles of consumers' preferences, needs, and wants. This empowers marketers to create fully individualized customer experiences that traditional marketing methods cannot optimize. The processing and analysis using AI systems can also be managed across consumer interactions through various, relevant touchpoints to increase consumer lifetime value (Parab, 2024). For instance, Netflix uses the AI-based, algorithmic capabilities of its platform to analyze the viewing history of each consumer to offer recommendations about the most suitable movies or TV Shows for that consumer. At the same time, Amazon recommends consumer-friendly products by using algorithms that analyze past purchases and browsing behaviors (Binlindah, 2024).

Personalization can go beyond product recommendations, including personalizing content with personalized emails, tailored layouts for their online engagement, and individualized ads. Artificial intelligence supports customizing customer experiences by personalizing the portfolio of available products that fit specific consumer profiles (Gajjar, 2024; Hemker et al, 2021). Furthermore, this degree of personalization increases the likelihood that consumers will find products that fulfill their needs (Mogaji & Jain, 2024). The ability to produce customized emails and posts on social media has also increased in natural language processing. In contrast, now artificial intelligence can create content aligned with consumer wants and needs (Sarioguz & Miser, 2024). AI-powered personalization raises ethical concerns about data privacy, algorithmic bias, and potential manipulation. Marketers must be transparent about how they use AI and give consumers control over their data usage (Janowski, 2025). Personalization is a strategy that provides the right content to the right person at the right time to create value (Gogua & Smirnova, 2020). When done correctly, AI can raise customer perceived value, enhance experience, and brand loyalty (Lopes, Gomes et al., 2024). In various business environments, customizing interactions to the needs and preferences of each client improves customer experiences (Bhuiyan, 2024; Patil, 2025). Your more positive feelings about a brand or company will also translate into savings: customers who feel understood by their brands are more likely to be loval, even if they can find cheaper products online. Additionally, AI can anticipate consumer needs, enabling proactive service that boosts satisfaction and long-term loyalty (Rane, Choudhary et al., 2024).

Nonetheless, as previously discussed, excessive personalization can result in adverse problems, including filter bubbles, issues of getting into consumers' heads, and exacerbating existing biases. Overall, thus, algorithms should be developed in a way that prompts consumers to encounter alternative ways of looking at and thinking about things, when feasible, while avoiding promoting poor or harmful stereotypes. Furthermore, it is critical for marketers to regularly audit their AI algorithms, so profits are not discriminating against categories of consumers. Additionally, retaining consumer trust requires addressing privacy breaches, data security, and transparency issues. If customers are concerned with their privacy, they could always choose to limit sharing with personal data, thus limiting the personalization efforts the marketer is trying to enhance. However, ethical data practices and fair, clear, and transparent communication will allow marketers to use the power of AI-generated personalization to establish good and mutual relationships with their consumers (Gonçalves et al., 2023).

Themes in Algorithmic Consumer Behavior

AI-enabled personalization improves customer experiences and satisfaction (Rane, Paramesha et al., 2024). However, it raises issues related to data privacy, algorithmic bias, and manipulation (Grewal, Satornino et al., 2024). By using AI to analyze large amounts of personal data, businesses can refine their marketing campaigns. This may impact how consumers make decisions in subtle but important ways (Lopes, Silva et al., 2024). Consumers need to know how their data is used, which helps them gain better control over their online experiences. Transparency, data security, and consumer control must be integral components of AI-driven personalization efforts to foster trust and ensure ethical practices (Patil, 2025).

Another primary concern is algorithmic bias. This occurs when biased, flawed, or otherwise faulty data is incorporated into the AI system (Lopes, Silva et al., 2024). Because of this, a business's AI algorithm may discriminate against a group of consumers by offering them specific products or different prices compared to other groups based on demographic traits (Bura & Myakala, 2024; Rane, Paramesha et al., 2024). Ensuring fairness and accountability in AI algorithms is crucial to avoid bias and treat all consumers equally, thereby protecting their rights. Marketers who actively identify and manage bias can promote fairness and prevent discrimination.

The possibility of manipulation is the final ethical issue raised by AI-driven personalization. AI algorithms can be used to influence consumers' decisions by subtly changing their perceptions or exploiting their cognitive biases (Gonçalves et al., 2023). It is essential to ensure that AI-driven personalization is used to inform and empower consumers, not to manipulate or deceive them. For example, recommender systems can create filter bubbles by consistently showing users content

that confirms their pre-existing beliefs, potentially limiting their exposure to diverse perspectives (Guan et al., 2022). Marketers must act ethically and utilize AI to enhance consumer experiences, rather than exploit weaknesses.

AI systems carry significant ethical implications, including bias, data quality, liability, and transparency concerns (Subías-Beltrán et al., 2024). The ethical issues worthy of investigation comprise safety and transparency, data privacy, fairness, and algorithmic biases (Naik et al., 2022). With AI algorithms, there is a possibility that new forms of personal information could be disclosed to consumers (Andreotta et al., 2021). To address these issues, relevant stakeholders will need to come together to develop ethical principles and regulations to govern AI in marketing. This group of stakeholders can be seen as marketers, policymakers, AI developers, and consumer advocates, all of whom are associated with marketing's responsibility for the ethical use of AI in the marketplace (Abujaber & Nashwan, 2024; Naik et al., 2022; Torkey et al., 2025).

When supplying AI systems, we must keep in mind the necessity of transparency so that the user is aware of how the AI arrived at a particular recommendation or decision. The necessity of openness is vital because we want to capitalize on the benefits that AI provides while minimizing potential adverse consequences (Radanliev et al., 2024). This suggests that we need to describe to consumers how algorithms and data work to make decisions. In addition to independent audits and assessments that may help identify and mitigate bias and other ethical concerns in AI systems (Dhopte & Bagde, 2023). Education is crucial for enhancing individuals' understanding and enabling them to make informed, ethical decisions related to AI technology (Lim et al., 2022).

Implication and Research Direction

The rapid development of technology in AI has sparked countless conversations around the ethics and sociology of the changes we undergo from AI systems. From driving cars to diagnosing medical conditions, AI is in every facet of everyday life; we are finally seeing the emergence of all the big questions of accountability, transparency, and fairness (Schultz & Seele, 2022; Zhang et al., 2021). Thus, many ethical issues surrounding transparency, data privacy, algorithmic fairness and bias, and privacy must be addressed. With AI algorithms that can find new types of personal data (Barton & Pöppelbuß, 2022), we need to address these ethical issues in a future-proof fashion with stakeholder consensus to develop ethics frameworks and governing provisions in the marketing of AI.

It is important for collaboration to include marketers, policymakers, AI developers, and consumer advocates to promote responsible and ethical practices with AI in the marketplace (Pham, 2025; Weiner et al., 2025). One of the most important aspects of ethical AI development is transparency, which allows users to see how AI arrives at its recommendations and decisions (Lepri et al., 2021). It is essential to emphasize transparency in AI system development, allowing users to understand how AI reached its recommendations or decisions (Gerke et al., 2020). This means providing clear explanations of both the algorithm's processes and the use of data as the decision-making context. Independent auditing and assessment can play a crucial role in identifying and addressing biases and other ethical issues within an AI system (Dey & Bhaumik, 2023). Education is also crucial in fostering public awareness and understanding of the ethical issues associated with AI technology (Karakuş et al., 2025). In the context of these ethical responsibilities, finding a balance between innovation and regulation is essential. If regulations are too strict, they may inhibit innovation and thereby hinder the development of practical AI applications.

Alternatively, an entirely unregulated environment may lead to ethical violations and societal harm. Therefore, both legislative policymakers and technologists must develop regulations that enable the innovation of AI while protecting people's rights and values. The ethical issues regarding the use of AI in healthcare research highlight the need for ethical principles to be integrated in all stages of the AI lifecycle (Abujaber & Nashwan, 2024). For a safe and effective transition of AI into healthcare systems, all policymakers will need to keep up with the rapid pace of AI technology development and implement regulations that protect patients without limiting innovation (Pham, 2025). Furthermore, a governance framework will be required to encourage the adoption and successful implementation of AI into the health sector (Mennella et al., 2024).

There have been significant innovations and efficiency gains from the applications of AI and robotics in healthcare (Elendu et al., 2023). However, ethical and regulatory concerns are there to be resolved for their responsible adoption (Elendu et al., 2023; Jeyaraman et al., 2023; Mennella et al., 2024). A few of the key issues are privacy, data security, bias, fairness, accountability, transparency, autonomy, and human oversight, along with broader societal implications (Elendu et al., 2023; Mennella et al., 2024; Pham, 2025). These concerns must be addressed to ensure that AI is beneficial to patients and clinicians and upholds ethical principles (Zhang & Zhang, 2023). AI progress could also contribute to healthcare disparities, hence the need for stringent governance mechanisms (Jeyaraman et al., 2023). Being an emerging technology, AI needs to remain on the policy radar. Through time, AI finds itself getting stronger in its interference with human and consumer behavior. With newer algorithms and larger datasets, AI will make more interventions into individual preferences and choices. This is an opportunity for consumers and businesses alike; however, it also has potential issues with its side-parties: Addressing individuals according to their recommendations and swiftly assisting them in making decisions, AI can create experiences. On the other hand, this leads to certain dangers concerning manipulation, privacy, and autonomy.

Conclusion and Managerial Implications

The theoretical approach to understanding AI's role in shaping our preferences and decision-making has identified a dynamic synergy of technological capabilities, psychological rationales, and ethical implications. The personalization of the consumer's experience, through targeted recommendations, enhanced predictive precision, or persuasive design choices, has demonstrated AI's ability to influence consumer choices (Faiyazuddin et al., 2025; Chopra, 2023). The algorithmic consumer is presenting new opportunities and challenges for businesses, governments, and everyday consumers. Change is part of the AI technologies; we must focus on purposeful and early action to support society in safely working with AI. For example, marketing practitioners must adopt transparency in AI use and keep customers informed about data collection and its use for targeted advertising (Kumar & Suthar, 2024). Transparency leads to stronger customer relationships, trust, and engagement (Kumar, Bapat et al., 2024). Policymakers and regulators have an essential part to play in developing frameworks and establishing standards for ethical use of AI in marketing (Wilson et al., 2024), which encompass the guidelines regarding data privacy, algorithmic bias, and consumer protection that foster a responsible and accountable AI environment.

Consumers need knowledge and functionality that empower them to understand interactions with AI systems, and there are aspects of this that pertain to education, data privacy management, and disabling personalized recommendation-centric features. A comprehensive collaboration among businesses, policymakers, academia, and consumers is necessary to derive the best benefits from AI while minimizing harm. Designing AI systems with the active involvement of final users instills trust, ensuring its application for the greater good (Gonçalves et al., 2023; Tiautrakul & Jindakul, 2019).

More and more, AI is redefining marketing operations by providing personalization, automating tasks, being proactive with analysis, and offering more profound insights into customers and marketing decisions (Gonçalves et al., 2023; Kumar, Bapat et al., 2024; Kumar, Ashraf et al., 2024). AI can bring about more customer engagement, risk management, and marketing efficiency through machine learning and computational intelligence (Zaman, 2022; Tiautrakul & Jindakul, 2019). The emergence of generative AI represents an unprecedented moment for augmentation and human capacity, coupled with special attention from the scholarly community (Hermann & Puntoni, 2024).

AI is more than a tool, but a paradigm shift in marketing and firm-consumer relationship (Kumar et al., 2019; Campbell et al., 2019; Beyari & Hashem, 2025; Janowski, 2025). As AI continues to progress, firms that do not adopt it will face pressure, including new ethical considerations for transparency, privacy, usability, and algorithm bias (Kumar & Suthar, 2024; Sharma & Sharma, 2023). Adherence to ethical practices and the taking of principled positions on AI use in marketing are essential to consumer trust (Hermann, 2021). AI innovation in digital

marketing introduces robust functionalities, such as personalization, predictive analytics, and integration with emerging technologies like IoT and cloud computing (Spais & Chryssochoidis, 2025; Wilson et al., 2024; Priyanka et al., 2023; Vlačić et al., 2021). These introduce automation and intelligent content creation but also raise ethical concerns, including privacy concerns, transparency concerns, and algorithmic accountability (Kumar, Ashraf et al., 2024). While AI is transforming marketing activities, there is a pressing need to align performance with ethics (Kumar, Ashraf et al., 2024). Enhancing human creativity with AI can produce more engaging content (Hartmann et al., 2024), but there are problems.

Limitations such as algorithmic bias, inexplicability, and control remain troublesome (Bruyn et al., 2020). Social media content generated by AI is both valuable and dangerous (Mohamed et al., 2024), with ethical and legal concerns, such as discrimination and data privacy, being called into question (Kumar & Suthar, 2024). AI marketing growth requires an understanding of the pros and cons of its use to be applied responsibly (Kumar, Ashraf et al., 2024). The unexplainability problem due to black-box algorithms increases the issues (Koswara & Herlina, 2025). It is a requirement that marketing and engineering experts adopt principles such as consumer privacy, information accuracy, and avoidance of algorithmic bias (Sharma & Sharma, 2023). As much as AI yields profound insights concerning consumer behavior, it can be misused if its use is not governed wisely.

References

- Abujaber, A. A., & Nashwan, A. J. (2024). Ethical framework for artificial intelligence in healthcare research: A path to integrity. *World Journal of Methodology*, 14(3), 94071-94071. https://doi.org/10.5662/wjm.v14.i3.94071
- Alghizzawi, M., Ahmed, E., Ezmigna, I., Ezmigna, A. A. R., & Omeish, F. (2024). The relationship between artificial intelligence and digital marketing in business companies. In Awwad, B. (Ed.), *The AI Revolution: Driving Business Innovation and Research*: Volume 2 (pp. 885-895). Cham: Springer Nature Switzerland. https://doi.org/10.1007/978-3-031-54383-8_67
- Alhitmi, H. K., Mardiah, A., Al-Sulaiti, K. I., & Abbas, J. (2024). Data security and privacy concerns of AI-driven marketing in the context of economics and business field: an exploration into possible solutions. *Cogent Business & Management*, 11(1), 2393743. https://doi.org/10.1080/23311975.2024.2393743
- Ameen, N., Sharma, G. D., Tarba, S., Rao, A., & Chopra, R. (2022). Toward advancing theory on creativity in marketing and artificial intelligence. *Psychology & Marketing*, *39*(9), 1802-1825. https://doi.org/10.1002/mar.21699
- Andreotta, A. J., Kirkham, N., & Rizzi, M. (2021). *AI, big data, and the future of consent. AI & Society,* 37(4), 1715. https://doi.org/10.1007/s00146-021-01262-5
- Bai, L. (2022). Analysis of the change of artificial intelligence to online consumption patterns and consumption concepts. *Soft Computing*, *26*(16), 7559-7569. https://doi.org/10.1007/s00500-021-06585-5
- Balakrishnan, J., & Dwivedi, Y. K. (2024). Conversational commerce: entering the next stage of AI-powered digital assistants. *Annals of Operations Research*, 333(2), 653-687. https://doi.org/10.1007/s10479-021-04049-5
- Barton, M.-C., & Pöppelbuß, J. (2022). Prinzipien für die ethische Nutzung künstlicher Intelligenz. HMD Praxis der Wirtschaftsinformatik, 59(2), 468-481. https://doi.org/10.1365/s40702-022-00850-3
- Beyari, H., & Hashem, T. N. (2025). The role of artificial intelligence in personalizing social media marketing strategies for enhanced customer experience. *Behavioral Sciences*, 15(5), 700. https://doi.org/10.3390/bs15050700

- Bhuiyan, M. S. (2024). The role of AI-enhanced personalization in customer experiences. *Journal of Computer Science and Technology Studies*, 6(1), 162-169. https://doi.org/10.32996/jcsts.2024.6.1.17
- Binlibdah, S. (2024). Investigating the role of artificial intelligence to measure consumer efficiency: The use of strategic communication and personalized media content. *Journalism and Media*, 5(3), 1142-1161. https://doi.org/10.3390/journalmedia5030073
- Bruyn, A. D., Viswanathan, V., Beh, Y. S., Brock, J. K.-U., & Wangenheim, F. von. (2020). Artificial intelligence and marketing: pitfalls and opportunities. *Journal of Interactive Marketing*, 51(1), 91-105. https://doi.org/10.1016/j.intmar.2020.04.007
- Bura, C., & Myakala, P. K. (2024). Advancing transformative education: generative AI as a catalyst for equity and innovation. *arXiv* preprint arXiv:2411.15971. https://doi.org/10.48550/arxiv.2411.15971
- Campbell, C., Sands, S., Ferraro, C., Tsao, H., & Mavrommatis, A. (2019). From data to action: how marketers can leverage AI. *Business Horizons*, 63(2), 227-243. https://doi.org/10.1016/j.bushor.2019.12.002
- Chandrakumar, H. (2024). The use of AI-driven personalization for enhancing the customer experience for Gen-Z. *Open Journal of Business and Management*, 12(6), 4472-4481. https://doi.org/10.4236/ojbm.2024.126225
- Chintalapati, S., & Pandey, S. K. (2021). Artificial intelligence in marketing: a systematic literature review. *International Journal of Market Research*, 64(1), 38-68. https://doi.org/10.1177/14707853211018428
- Chopra, R. (2023). Artificial intelligence in robotics: (review paper). International Journal for Research in Applied Science and Engineering Technology, 11(4), 2345. https://doi.org/10.22214/ijraset.2023.50635
- Dey, D., & Bhaumik, D. (2023). APPRAISE: A governance framework for innovation with AI systems. arXiv preprint arXiv:2309.14876. https://doi.org/10.48550/arxiv.2309.14876
- Dhopte, A., & Bagde, H. (2023). Smart smile: revolutionizing dentistry with artificial intelligence. *Cureus*, 15(6). https://doi.org/10.7759/cureus.41227
- Elendu, C., Amaechi, D. C., Elendu, T. C., Jingwa, K. A., Okoye, O. K., Okah, M. J., Ladele, J. A., Farah, A. H., & Alimi, H. A. (2023). Ethical implications of AI and robotics in healthcare: a review. *Medicine*, 102(50), e36671. https://doi.org/10.1097/md.00000000000036671
- Faiyazuddin, M., Rahman, S. J. Q., Anand, G., Siddiqui, R. K., Mehta, R., Khatib, M. N., Gaidhane, S., Zahiruddin, Q. S., Hussain, A., & Sah, R. (2025). The impact of artificial intelligence on healthcare: a comprehensive review of advancements in diagnostics, treatment, and operational efficiency. *Health Science Reports*, 8(1), e70312. https://doi.org/10.1002/hsr2.70312
- Gajjar, T. (2024). Revolutionizing retail: the synergy of AI and AR. SSRN Electronic Journal. https://doi.org/10.2139/ssrn.4778277
- Gerke, S., Minssen, T., & Cohen, G. (2020). Ethical and legal challenges of artificial intelligence-driven healthcare. In Bohr, A., & Memarzadeh, K. (Eds.), *Artificial Intelligence in Healthcare* (pp. 295-336). Academic Press. https://doi.org/10.1016/b978-0-12-818438-7.00012-5
- Giarmoleo, F. V., Ferrero, I., Rocchi, M., & Pellegrini, M. M. (2024). What ethics can say on artificial intelligence: insights from a systematic literature review. *Business and Society Review*, 129(2), 258-292. https://doi.org/10.1111/basr.12336

- Gkikas, D. C., & Theodoridis, P. K. (2021). AI in consumer behavior. In Virvou, M., Tsihrintzis, G. A., Tsoukalas, L. H., & Jain, L. C. (Eds.), *Advances in Artificial Intelligence-based Technologies:*Selected Papers in Honour of Professor Nikolaos G. Bourbakis—Vol. 1 (pp. 147-176). Cham: Springer International Publishing. https://doi.org/10.1007/978-3-030-80571-5_10
- Gogua, M., & Smirnova, M. (2020). Revisiting personalization through customer experience journey. *Vestnik of Saint Petersburg University Management*, 19(4), 430-460. https://doi.org/10.21638/11701/spbu08.2020.402
- Gonçalves, A. R., Pinto, D. C., Rita, P., & Pires, T. C. (2023). Artificial intelligence and its ethical implications for marketing. *Emerging Science Journal*, 7(2), 313-327. https://doi.org/10.28991/esj-2023-07-02-01
- Grewal, D., Guha, A., & Becker, M. (2024). AI is changing the world: for better or for worse? *Journal of Macromarketing*, 44(4), 870-882. https://doi.org/10.1177/02761467241254450
- Grewal, D., Satornino, C. B., Davenport, T. H., & Guha, A. (2024). How generative AI is shaping the future of marketing. *Journal of the Academy of Marketing Science*, 1-21. https://doi.org/10.1007/s11747-024-01064-3
- Guan, H., Dong, L., & Zhao, A. (2022). Ethical risk factors and mechanisms in artificial intelligence decision making. *Behavioral Sciences*, 12(9), 343. https://doi.org/10.3390/bs12090343
- Guerra-Tamez, C. R., Flores, K. K., Serna-Mendiburu, G. M., Robles, D. C., & Cortés, J. I. (2024). Decoding gen Z: AI's influence on brand trust and purchasing behavior. *Frontiers in Artificial Intelligence*, 7, 1323512. https://doi.org/10.3389/frai.2024.1323512
- Gündüzyeli, B. (2024). Artificial intelligence in digital marketing within the framework of sustainable management. *Sustainability,* 16(23), 10511. https://doi.org/10.3390/su162310511
- Haleem, A., Javaid, M., Qadri, M. A., Singh, R. P., & Suman, R. (2022). Artificial intelligence (AI) applications for marketing: a literature-based study. *International Journal of Intelligent Networks*, 3, 119-132. https://doi.org/10.1016/j.ijin.2022.08.005
- Hartmann, J., Exner, Y., & Domdey, S. (2024). The power of generative marketing: can generative AI create superhuman visual marketing content? *International Journal of Research in Marketing*, 42(1), 13-31. https://doi.org/10.1016/j.ijresmar.2024.09.002
- Hemker, S., Herrando, C., & Constantinides, E. (2021). The transformation of data marketing: how an ethical lens on consumer data collection shapes the future of marketing. *Sustainability*, 13(20), 11208. https://doi.org/10.3390/su132011208
- Hermann, E. (2021). Leveraging artificial intelligence in marketing for social good—an ethical perspective. *Journal of Business Ethics*, 179(1), 43-61. https://doi.org/10.1007/s10551-021-04843-y
- Hermann, E., & Puntoni, S. (2024). Artificial intelligence and consumer behavior: from predictive to generative AI. *Journal of Business Research*, 180, 114720. https://doi.org/10.1016/j.jbusres.2024.114720
- Huang, M., & Rust, R. T. (2020). A strategic framework for artificial intelligence in marketing. *Journal of the Academy of Marketing Science*, 49(1), 30-50. https://doi.org/10.1007/s11747-020-00749-9
- Janowski, A. (2025). The effectiveness of life insurance sales force training: welcome "me and AI." *Economies*, 13(4), 101. https://doi.org/10.3390/economies13040101
- Jeyaraman, M., Balaji, S., Jeyaraman, N., & Yadav, S. (2023). Unraveling the ethical enigma: artificial intelligence in healthcare. *Cureus*, 15(8). https://doi.org/10.7759/cureus.43262

- Karakuş, N., Gedik, K., & Kazazoğlu, S. (2025). Ethical decision-making in education: a comparative study of teachers and artificial intelligence in ethical dilemmas. *Behavioral Sciences*, 15(4), 469. https://doi.org/10.3390/bs15040469
- Kirk, C. P., & Givi, J. (2024). The AI-authorship effect: understanding authenticity, moral disgust, and consumer responses to AI-generated marketing communications. *Journal of Business Research*, 186, 114984. https://doi.org/10.1016/j.jbusres.2024.114984
- Koswara, A. Y., & Herlina, L. (2025). The ethical deviations of AI in marketing practices: a critical review from halal perspectives. Research of Islamic Economics, 2(2), 105-116. https://doi.org/10.58777/rie.v2i2.393
- Kumar, A., Bapat, G., Kumar, A., Hota, S. L., Abishek, G. D., & Vaz, S. (2024). Unlocking brand excellence: harnessing AI tools for enhanced customer engagement and innovation. *Engineering Proceedings*, 59(1), 204. https://doi.org/10.3390/engproc2023059204
- Kumar, D., & Suthar, N. (2024). Ethical and legal challenges of AI in marketing: an exploration of solutions. *Journal of Information Communication and Ethics in Society*, 22(1), 124-144. https://doi.org/10.1108/jices-05-2023-0068
- Kumar, V., Ashraf, A. R., & Nadeem, W. (2024). AI-powered marketing: what, where, and how? *International Journal of Information Management*, 77, 102783. https://doi.org/10.1016/j.ijinfomgt.2024.102783
- Kumar, V., Rajan, B., Venkatesan, R., & Lecinski, J. (2019). Understanding the role of artificial intelligence in personalized engagement marketing. *California Management Review, 61*(4), 135-155. https://doi.org/10.1177/0008125619859317
- Lepri, B., Oliver, N., & Pentland, A. (2021). Ethical machines: the human-centric use of artificial intelligence. *IScience*, 24(3), 102249. https://doi.org/10.1016/j.isci.2021.102249
- Lim, J., Seo, J., & Kwon, H. (2022, May). The role of higher education for the ethical AI society. In *The International FLAIRS Conference Proceedings* (Vol. 35). https://doi.org/10.32473/flairs.v35i.130609
- Lopes, J. M., Gomes, S., Nogueira, E., & Trancoso, T. (2024). AI's invisible touch: how effortless browsing shapes customer perception, experience and engagement in online retail. *Cogent Business & Management*, 12(1), 2440628. https://doi.org/10.1080/23311975.2024.2440628
- Lopes, J. M., Silva, L., & Massano-Cardoso, I. (2024). AI meets the shopper: psychosocial factors in ease of use and their effect on e-commerce purchase intention. *Behavioral Sciences*, 14(7), 616. https://doi.org/10.3390/bs14070616
- Ma, L., & Sun, B. (2020). Machine learning and AI in marketing connecting computing power to human insights. *International Journal of Research in Marketing*, 37(3), 481-504. https://doi.org/10.1016/j.ijresmar.2020.04.005
- Madanchian, M. (2024). The impact of artificial intelligence marketing on e-commerce sales. Systems, 12(10), 429. https://doi.org/10.3390/systems12100429
- Maiti, M., Kayal, P., & Vujko, A. (2025). A study on ethical implications of artificial intelligence adoption in business: challenges and best practices. *Future Business Journal*, 11(1), 34. https://doi.org/10.1186/s43093-025-00462-5
- Mennella, C., Maniscalco, U., Pietro, G. D., & Esposito, M. (2024). Ethical and regulatory challenges of AI technologies in healthcare: a narrative review. *Heliyon*, 10(4). https://doi.org/10.1016/j.heliyon.2024.e26297

- Mirwan, S. H., Ginny, P. L., Darwin, D., Ghazali, R., & Lenas, M. N. J. (2023). Using artificial intelligence (AI) in developing marketing strategies. *International Journal of Applied Research and Sustainable Sciences*, 1(3), 225-238. https://doi.org/10.59890/ijarss.v1i3.896
- Mogaji, E., & Jain, V. (2024). How generative AI is (will) change consumer behaviour: postulating the potential impact and implications for research, practice, and policy. *Journal of Consumer Behaviour*, 23(5), 2379-2389. https://doi.org/10.1002/cb.2345
- Mohamed, E. A. S., Osman, M. E., & Mohamed, B. A. (2024). The impact of artificial intelligence on social media content. *Journal of Social Sciences*, 20(1), 12-16. https://doi.org/10.3844/jssp.2024.12.16
- Naik, N., Hameed, B. M. Z., Shetty, D. K., Swain, D., Shah, M., Paul, R., Aggarwal, K., Ibrahim, S., Patil, V., Smriti, K., Shetty, S., Prasad, B., Chłosta, P., & Somani, B. (2022). Legal and ethical consideration in artificial intelligence in healthcare: who takes responsibility? *Frontiers in Surgery*, *9*, 862322. https://doi.org/10.3389/fsurg.2022.862322
- Nassar, S. (2024). AI and algorithms tackling the media and creative industries: addressing societal consumer behavior directions and challenges in the next digital frontier. *Arab Media and Society, 37.* https://doi.org/10.70090/sn24aiat
- Nesterenko, V., & Олефіренко, О. М. (2023). The impact of AI development on the development of marketing communications. *Marketing and Management of Innovations*, 14(1), 169-181. https://doi.org/10.21272/mmi.2023.1-15
- Parab, G. U. (2024). AI-driven personalization in retail analytics: transforming customer experiences. *International Journal of Research in Computer Applications and Information Technology* (IJRCAIT), 7(2). https://doi.org/10.34218/ijrcait_07_02_176
- Patil, D. (2025). Artificial intelligence-driven customer service: enhancing personalization, loyalty, and customer satisfaction. SSRN Electronic Journal. https://doi.org/10.2139/ssrn.5057432
- Pham, T. D. (2025). Ethical and legal considerations in healthcare AI: innovation and policy for safe and fair use. Royal Society Open Science, 12(5), 241873. https://doi.org/10.1098/rsos.241873
- Priyanka, A. L., Harihararao, M., Prasanna, M., & Deepika, Y. (2023). A study on artificial intelligence in marketing. *International Journal for Multidisciplinary Research*, 5(3), 1-12. https://doi.org/10.36948/ijfmr.2023.v05i03.3789
- Radanliev, P., Santos, O., Brandon-Jones, A., & Joinson, A. (2024). Ethics and responsible AI deployment. Frontiers in Artificial Intelligence, 7, 1377011. https://doi.org/10.3389/frai.2024.1377011
- Rane, N., Choudhary, S., & Rane, J. (2024). Artificial intelligence and machine learning in business intelligence, finance, and e-commerce: a review. *SSRN Electronic Journal*. https://doi.org/10.2139/ssrn.4843988
- Rane, N., Paramesha, M., Choudhary, S., & Rane, J. (2024). Artificial intelligence in sales and marketing: enhancing customer satisfaction, experience and loyalty. *SSRN Electronic Journal*. https://doi.org/10.2139/ssrn.4831903
- Sarioguz, O., & Miser, E. (2024). AI-powered business model innovation: analyzing the implications of generative AI on value creation, operational efficiency and market dynamics. *World Journal of Advanced Engineering Technology and Sciences*, 13(2), 215-229. https://doi.org/10.30574/wjaets.2024.13.2.0564

- Schultz, M. D., & Seele, P. (2022). Towards AI ethics' institutionalization: knowledge bridges from business ethics to advance organizational AI ethics. *AI and Ethics*, *3*(1), 99-111. https://doi.org/10.1007/s43681-022-00150-y
- Shaik, M. (2023). Impact of artificial intelligence on marketing. East Asian Journal of Multidisciplinary Research, 2(3), 993-1004. https://doi.org/10.55927/eajmr.v2i3.3112
- Sharma, A. K., & Sharma, R. (2023). Considerations in artificial intelligence-based marketing: an ethical perspective. *Applied Marketing Analytics*, 9(2), 162-172. https://doi.org/10.69554/rapq3226
- Singh, P. K. (2024). The role of artificial intelligence in personalized marketing strategies of Amazon. *International Journal of Scientific Research in Engineering and Management*, 8(4), 1-5. https://doi.org/10.55041/ijsrem32818
- Spais, G. S., & Chryssochoidis, G. (2025). Trends and future of artificial intelligence (AI), machine learning (ML) algorithms, and data analytics and their applications and implications for digital marketing and digital promotions. *Journal of Marketing Analytics*, 1-4. https://doi.org/10.1057/s41270-025-00406-6
- Subías-Beltrán, P., Pitarch, C., Migliorelli, C., Marte, L., Galofré, M., & Orte, S. (2024). The role of transparency in AI-driven technologies: targeting healthcare. In Dadios, E. P. (Ed.), *Artificial Intelligence-Social, Ethical and Legal Issues*. IntechOpen. https://doi.org/10.5772/intechopen.1007444
- Tadimarri, A., Jangoan, S., Sharma, K. K., & Gurusamy, A. (2024). AI-powered marketing: transforming consumer engagement and brand growth. *International Journal for Multidisciplinary Research*, 6(2), 1-11. https://doi.org/10.36948/ijfmr.2024.v06i02.14595
- Tiautrakul, J., & Jindakul, J. (2019). The artificial intelligence (AI) with the future of digital marketing. SSRN Electronic Journal. https://doi.org/10.2139/ssrn.3405184
- Torkey, H., Hashish, S., Souissi, S., Hemdan, E. E., & Mahmoud, A. S. A. (2025). Seizure detection in medical IoT: hybrid CNN-LSTM-GRU model with data balancing and XAI integration. *Algorithms*, 18(2), 77. https://doi.org/10.3390/a18020077
- Venkatesan, R., & Lecinski, J. (2021). The AI Marketing Canvas: A Five-Stage Road Map to Implementing Artificial Intelligence in Marketing. Stanford University Press. https://doi.org/10.1515/9781503628045
- Verma, S., Sharma, R., Deb, S., & Maitra, D. (2021). Artificial intelligence in marketing: systematic review and future research direction. *International Journal of Information Management Data Insights*, 1(1), 100002. https://doi.org/10.1016/j.jjimei.2020.100002
- Vlačić, B., Corbo, L., Silva, S. C. e, & Dabić, M. (2021). The evolving role of artificial intelligence in marketing: a review and research agenda. *Journal of Business Research*, 128, 187. https://doi.org/10.1016/j.jbusres.2021.01.055
- Weiner, E., Dankwa-Mullan, I., Nelson, W. A., & Hassanpour, S. (2025). Ethical challenges and evolving strategies in the integration of artificial intelligence into clinical practice. *PLOS Digital Health*, *4*(4), e000810. https://doi.org/10.1371/journal.pdig.0000810
- Wilson, G., Johnson, O., & Brown, W. L. (2024). The impact of artificial intelligence on digital marketing strategies. *Preprints*. https://doi.org/10.20944/preprints202408.0276.v1
- Yazdani, A., & Darbani, S. (2023). The impact of AI on trends, design, and consumer behavior. KMAN AI Tech, 1(4), 4-10. https://doi.org/10.61838/kman.aitech.1.4.2

- Yue-jiao, F., & Liu, X. (2022). Exploring the role of AI algorithmic agents: the impact of algorithmic decision autonomy on consumer purchase decisions. *Frontiers in Psychology, 13*, 1009173. https://doi.org/10.3389/fpsyg.2022.1009173
- Zaman, K. (2022). Transformation of marketing decisions through artificial intelligence and digital marketing. *Journal of Marketing Strategies*, 4(2), 353-364. https://doi.org/10.52633/jms.v4i2.210
- Zhang, J., & Zhang, Z. (2023). Ethics and governance of trustworthy medical artificial intelligence. *BMC Medical Informatics and Decision Making*, 23(1), 7. https://doi.org/10.1186/s12911-023-02103-9
- Zhang, Y., Wu, M., Tian, G. Y., Zhang, G., & Lü, J. (2021). Ethics and privacy of artificial intelligence: understandings from bibliometrics. *Knowledge-Based Systems*, 222, 106994. https://doi.org/10.1016/j.knosys.2021.106994
- Zulaikha, S., Mohamed, H., Kurniawati, M., Rusgianto, S., & Rusmita, S. A. (2025). Customer predictive analytics using artificial intelligence. *The Singapore Economic Review*, 70(04), 1009-1020. https://doi.org/10.1142/s0217590820480021