



The Impact of Artificial Intelligence-Driven Digital Marketing Strategies on Pharmaceutical Consumer Behavior

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Abstract. Artificial intelligence AI is the leading technology that has transformed digital marketing strategies affecting diverse industries such as the pharmaceutical sector. The focus of this investigation into how AI can affect doctors' prescribing decisions is the effects of interactions with pharmaceutical content targeting by digital marketing. Employing a qualitative method in this study, this paper synthesizes recommendations from a comprehensive literature analysis in order to investigate the relationship between AI applications, consumer buying behavior, and the potential societal effect of the use of AI in pharmaceutical promotional appeals. The study examines how AI improves paid advertising and makes it possible for pharmaceutical firms to produce content that will interest targeted groups that, in turn affects doctors' interaction with promotional messages. Although AI can provide tangible benefits at the same time, sparking new efficiency and precision in the marketing, it is crucial to address some of ethical issues, including data privacy issues or potential bias, and negative consequences of very high-level algorithmization in marketing strategy. Research evidence indicates that AI technologies are conventionally instrumental in defining present and future marketing processes in the pharmaceutical industry. The study underscores the dual-edged nature of AI: its potential to provide notable social and professional rewards and at the same time, its potential to require the evaluation of its effects. This work is useful for stakeholders who would wish to get a better understanding about the effectiveness of AI in pharmaceutical digital marketing.

Keywords: Artificial Intelligence Marketing · Pharmaceutical Customer Behavior · Social Media Marketing · Physicians · Marketing Artificial Intelligence · Quantitative Analysis · Decision Making

1 Introduction

1.1 Background

Conventional marketing has been the main practice in the pharmaceutical industry for long, with frequent, direct communication between drug salespersons and doctors, communicating to groups of doctors and physicians, and other educational-related marketing.

These have acted as primary channels through which information on drugs is made available, doctors' prescription patterns have changed as well, and the relationship between drug manufacturers and doctors is built. However, pharmaceutical marketing is on the verge of evolution with technological development and the rise of artificial intelligence AI in marketing.

AI has brought about new perspectives of digital marketing through personalization [1], which is enabled by AI's huge data collection and processing capabilities. The application of AI in pharmaceutical marketing ensures that the content that pharmaceutical companies want to share with the doctors is relevant and personalized while also inclining toward the preferred doctor's choice. Some of the above strategies include the use of prescriptive analytics, which uses machine learning algorithms to study prescription patterns; the use of predictive analytics, which helps anticipate future needs; as well as the use of natural language processing, such as the use of chat bots to serve doctors' questions quickly. Due to the application of AI in these marketing efforts, there is the possibility of making communication more accurate and well-informed, possibly leading to the right decisions by doctors [31]. Nevertheless, the extent of the impact of AI has not been fully determined as to how it will influence doctors' prescription behaviors and interactions with pharmaceutical products.

1.2 Research Problem

Although it has become apparent that organizations in the pharmaceutical industry are adopting AI-driven digital marketing tools, there needs to be more known about how these technologies impact the actions of the target audience, namely doctors. AI is slowly finding its way into marketing tactics in the pharmaceutical industry about how doctors are targeted. However, the effectiveness of such tactics can create a debate on their efficiency in transforming doctors' prescription behavior. Furthermore, the ethics surrounding the use of transparency and fairness of artificial intelligence in marketing offer further challenges. It is, therefore, important to gain insight into how physicians perceive AI-driven marketing strategies and how the latter influences their decision-making patterns. This research aims to fill this gap by buying AI's impact on pharmaceutical marketing.

1.3 Research Aim

The broad research question is how AI-enhanced digital marketing techniques change doctors' consumer behavior, especially regarding pharmaceutical firms and prescription trends. Thus, this research seeks to evaluate the efficiency of AI-used content to help determine how AI can ensure that marketing-related strategies correspond to doctors' clinical demands and professional actions.

1.4 Research Objectives

1. To examine the level of AI application in digital marketing to doctors in the pharmaceutical industries.

2. To explore how AI-assisted content affects doctors' interactions with pharmaceutical firms and their choice regarding prescriptions.
3. To evaluate the nature and potential concerns concerning the ethical application of AI in promoting drugs and medicine.

1.5 Research Questions

1. Self-Assessment: What are the impacts of AI-driven digital Marketing efforts on the doctors' decision-making in the scope of pharmaceutical marketing?
2. What facts and considerations make AI-driven content effective in reaching doctors?
3. What ethical issues are likely to come about because of the use of AI in marketing to doctors, and how may they be prevented?

1.6 Research Scope

This present research examines marketing automation technology and digital marketing that involves artificial intelligence brought about by pharmaceutical manufacturing firms and their impact on the consumer behavior of doctors involved in prescriptions [2]. It investigates how the emerging technologies of predictive analytics, content personalization, and autonomous systems influence doctors' decisions and suggestions, especially in developed economies. In this study, secondary data collection is used together with the literature analysis of the articles between 2018 and 2023 to guarantee the relevancy of the collected data. The scope concerns developed PMs, including implant and Prime markets where AI adoption is already under practice, and its ideas contain the applicable digest realistic to doctors' marketing strategies.

2 Literature Review

A literature review analyzes articles and theoretical frameworks pertinent to the given subject concerning the effects of AI-implemented promotional techniques in the pharmaceutical industry on doctors' consumer behavior. Collectively, it integrates data from multiple investigations to present an overview of how AI solutions affect decision-making, interaction with their marketing material, and the ethical concerns tied to these approaches [11].

2.1 Conceptual Framework

The conceptual framework of this literature review is structured around three main areas: AI and its role in digital marketing, consumer behavior in the pharmaceutical industry, and ethical issues. Each area is discussed to elucidate the effects of the various AI technologies on doctors' relations with the pharmaceutical industries and the effects of these relations on prescription behavior (Fig. 1).

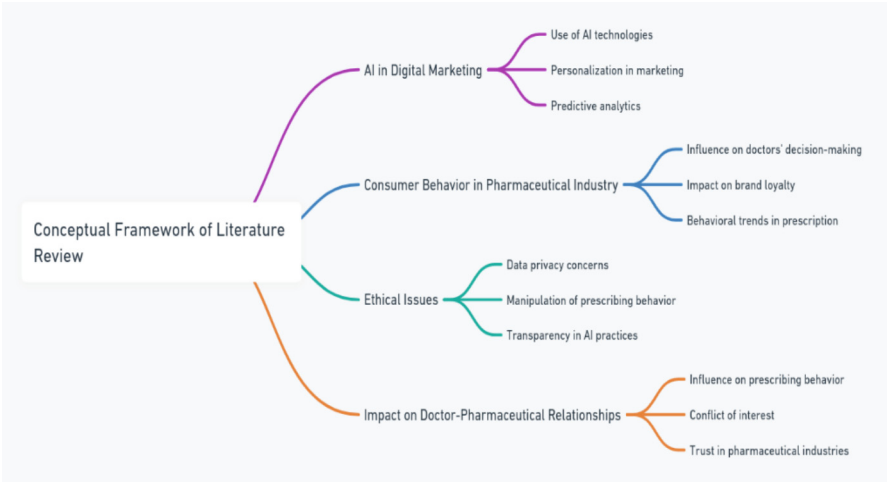


Fig. 1. Flow chart of Conceptual Frame work (self-generated).

2.2 AI in Digital Marketing

AI technologies have impacted digital marketing in a way that they have facilitated one-to-one communication. Ref Qingwei Huang and Michael Rust AI’s capability to use big data makes marketing decisions at the doctor level based on the doctor’s prescription, interest, and communication profiles, among others, as noted by Huang and Rust in 2021. This is a process of achieving personalization using technologies, including machine learning, that helps in predicting the needs of the doctors and preferences of the predictive analytics that helps in predicting the people’s behavior in the future depending on the previous data set.

Luo et al. (2020) acknowledge that AI recommendation systems are crucial to customizing marketing content [14]. These systems employ past data to present the appropriate information on a drug, any education materials, and new products essential for a doctor practicing in each field of specialty. Jarrahi et al. (2021) also investigate the function of natural language processing (NLP) in dynamite and interacting marketing. Features like chat bots/ virtual assistants assist doctors by responding to their questions immediately, improving the effectiveness of pharmaceutical marketing.

Pharmaceutical Consumer Behavior. Based on the pharmaceutical marketing information consumed by doctors, the type, relevance, and quality of information affect them. According to Feinberg et al. (2020), the established findings proved that the AI’s recommendations can cause changes in doctors’ prescriptions when the recommendations are in tune with the actual practice and the practice as recommended in the existent guidelines. Engaging content based on doctors’ prior prescribing behavior and their interests will lead them to have higher levels of confidence in the information being provided and, hence, have a higher propensity to adopt the new content into their prescribing behavior [8].

According to Steinhoff and Palmatier (2021), pharmaceutical firms can classify doctors into different personas using AI technologies, enabling firms to target doctors more

effectively. This research suggests that doctors willing to accept technology are more likely to accept AI-driven marketing than old-school doctors. However, it is immediately clear that the delivery of recommendations based on evidence and experience has a tangible influence on prescription behavior, demonstrating AI's capacity to reduce decision-making empathy.

As per Agarwal et al. (2021), such AI tools can overcome information overload by helping doctors with the relevant drug information related to their medical specialties. This strategic targeting assists doctors in making the right decisions independently and faster, affecting their interaction with pharmaceutical marketing in specific ways (Fig. 2).

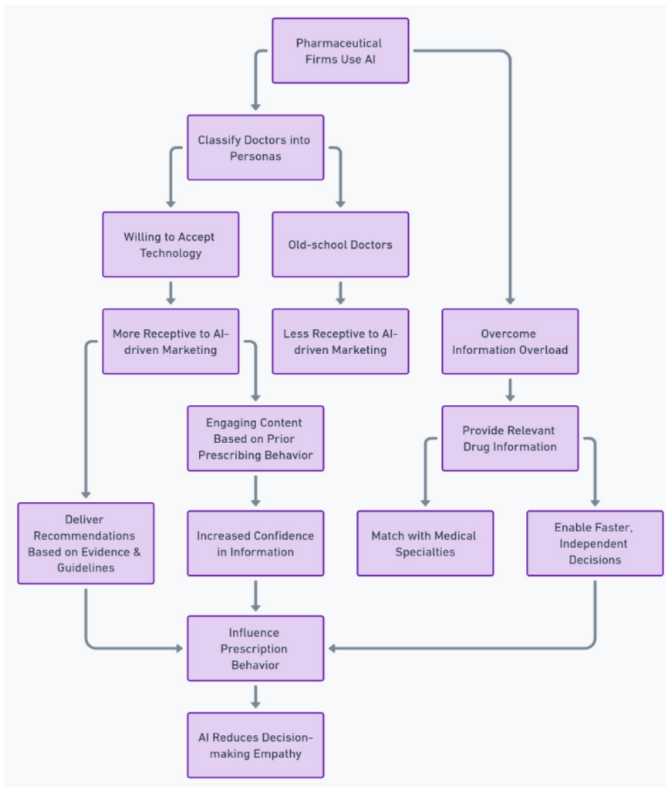


Fig. 2. Flow chart showing AI in Pharmaceutical sector (Self-made).

Ethical Considerations. The integration of AI in marketing, specifically pharmaceuticals, implies some questions that need to be answered to avoid the wrong application of AI. According to Cheng et al. (2022), AI applied in creating content may inevitably add some bias and skew the content produced in marketing. For instance, if such systems rank drugs in a hospital depending on the strategic goals of marketing the drugs contrary to the effectiveness of the drugs, this might be deemed unethical because it may influence the kind of information being passed to the doctors.

According to Kietzmann et al. (2021), it is necessary to note that data privacy and the questions of transparency remain crucial when it comes to using AI in marketing. Since pharma industries are gathering a lot of data from doctors, it is pertinent that the data is used appropriately and rightfully. As echoed by other authors, there is a need for definite policies that regulate the usage of the doctor's data and the likely consequences of violating privacy.

According to Floridi et al. (2020), there is a need to set the right ethical benchmarks for the marketing of AI. They insist on responsibility and justice as to the AI algorithms and the protection of doctors reverting to the sites, as there is a danger of being exploited by what these marketing gurus are showcasing. This is why there is a need for ethical policies: AI technologies are constantly developing and increasingly being used in product promotion in the pharmaceutical industry.

3 Research Methodology

3.1 Research Design

The method used in this research is qualitative research to determine how AI-driven digital marketing techniques affect doctors' behavior in their capacity as consumers of pharmaceutical products. The research employs the use of secondary data analysis; this means the research will not collect new data but will rather analyze data that is already analyzed. The choice of the qualitative approach is appropriate because it delves into the phenomena under investigation to determine their qualities, including the usage of AI technologies in the pharma field and consumers' behavior [4]. In this manner, this research identifies patterns, lessons, and theoretical frameworks embedded in the material previously published in academic papers, industry reports, and case studies.

3.2 Data Collection

Data for this study was obtained from secondary sources, which comprised scholarly journal articles, pharmaceutical industry publications, and AI marketing-related articles [13]. In secondary data collection, data is collected without creating new data; instead, the data reviewed and compiled is used from another research. Thus, this method is suitable for instances where the area under study is well developed, such as AI digital marketing, where sufficient studies have been done and are freely available. In doing so, it is possible to define trends, recurring themes, and important findings based on existing studies to be incorporated into the research's theoretical framework and conclusion.

3.3 Inclusion Criteria

Timeframe. The investigations were carried out with the help of the databases published throughout the years 2018–2023: such an approach enables us to consider the recent developments in the sphere of AI technologies' implementation in the context of pharmaceutical marketing [30].

Relevance to AI in Digital Marketing. For this analysis, only research works that have focused on the application of AI in the marketing domain and more so in the pharmaceutical business were deemed relevant for review. This ensures that the concern is kept on how AI impacts advertising endeavors directed at doctors.

Pharmaceutical Industry Focus. The selected studies had to discuss the effect of AI on healthcare personnel, especially doctors – as the targeted consumers in this case [12]. Adding industry reports into the equation helped get a realistic outlook on using AI technologies and their performance in the pharmaceutical industry.

Exclusion Criteria. Irrelevant Industries: Studies concerning industries other than healthcare, such as retail or finance, were excluded. While marketing using artificial intelligence is affecting many industries, this research focuses on its impact on doctors in the pharmaceutical industry [22].

Non-AI Marketing Studies. Studies that described the use of digital marketing approaches without considering the use of AI technologies were also omitted since the concern is how AI adapts conventional marketing management practices.

Healthcare Consumer Research Excluding Doctors. Thus, articles that covered consumers other than healthcare professionals, for example, patients and the public, were excluded. This paper focuses on doctors as the key decision-makers regarding this phenomenon of marketing pharmaceuticals.

For this research, the data analysis was done through thematic analysis since it is a qualitative analysis well suited to identifying themes from the existing literature. That way, gathering a deep insight into how digital marketing through AI influences doctors, particularly in the pharmaceutical industry, was possible (Fig. 3).

Step 1: Familiarization with the Data. The first and, perhaps, the most important of the steps in thematic analysis is to become intimately familiar with the data collected. This included analyzing articles, reports, and cases on AI uses in pharmaceutical marketing from 2018 to 2023. Since the research is conducted on secondary data, it was important to get acquainted with the context and findings of the prior research [3].

Step 2: Initial Coding. After the method of familiarization, an approach to categorizing literature was applied. They were coding, which means underlining parts of the text related to the research questions. In this case, important parts concerning how AI in marketing affects behavior, how doctors make decisions, and the ethical issues have been underlined [25]. For instance, when a study discussed using predictive analytics to message doctors based on their prescription patterns, the code used was ‘personalization of content.’ Other similar topics were instances where ethical questions such as algorithmic explainability or data privacy had been voiced.

Step 3: Identification of Themes. Subsequently, codes like each other were aggregated into general themes corresponding to the study’s objectives. The main themes identified include:

Personalization of Content AI tools, including machine learning and NLP, allow the personalization of marketing content to meet doctors’ specific needs and wants. The sources uncovered showed that custom content is a great asset to interaction, which means it is easier to get the attention of the targeted doctors.

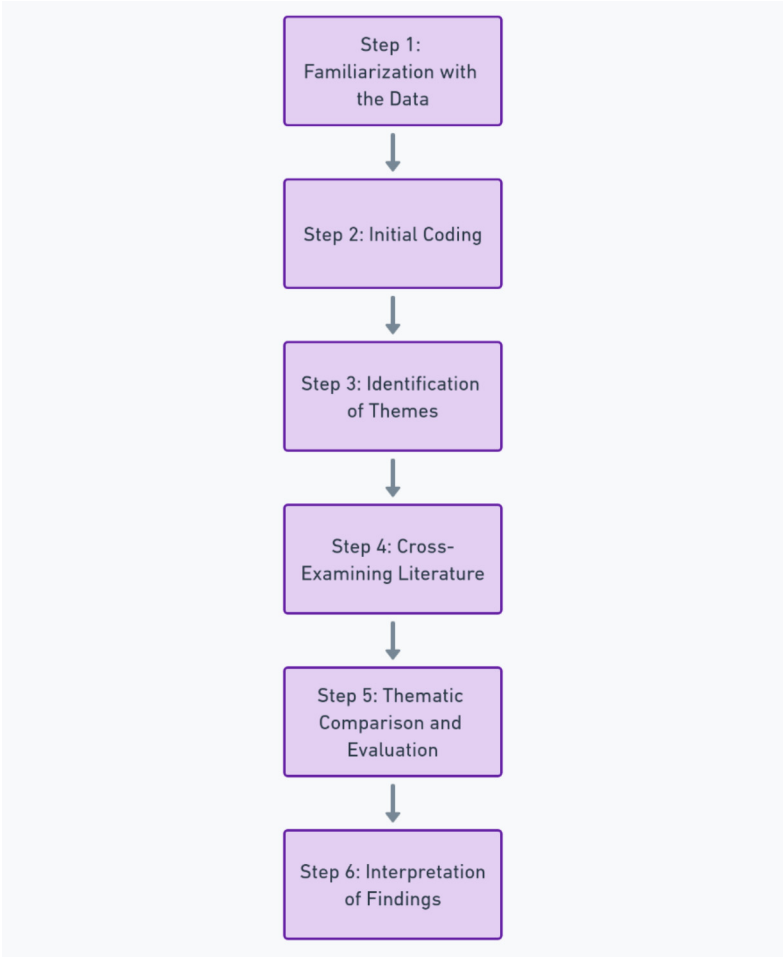


Fig. 3. Flow chart of Data Analysis (Self-made).

Influence on Decision-Making Another pattern that emerges in the context analysis is how much marketing resulting from AI affects the prescription decisions made by doctors [9]. Research revealed that AI could bias medical practitioners to recommend pharmaceutical products by suggesting the warrants of employing data analytically based prescriptive analytics.

Ethical Challenges A considerable number of articles were concerned with the possible ethical issues arising from the application of AI in PHARMA marketing [23]. Areas like the transparency of algorithms, biases that may exist in AI recommendations, and data protection concerns became ringing bells, with demands for a better code of ethics concerning the use of AI to reach healthcare practitioners common (Fig. 4).

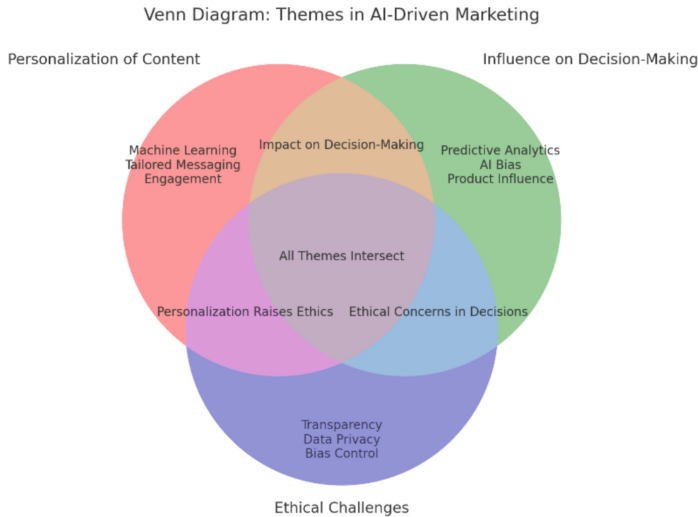


Fig. 4. Venn diagram explaining Themes in AI driven Marketing (Self-made).

Step 4: Cross-Examining Literature. The next step is the cross-source analysis aimed at defining common patterns and the variability of the effectiveness of AI-infused marketing strategies. This cross-examination showed similar results regarding AI's value in targeting the marketing message and its effect on decision-making [33]. Yet, it also pointed out disparities depending on the location and specialization of the medical facility. For instance, analysis from developed markets revealed higher AI implementation than the emerging markets and better responses to AI that tried to change the prescription pattern.

Step 5: Thematic Comparison and Evaluation. Based on the comparison of themes, the efficiency of various AI tools like machine learning recommendation engines and natural language processing chat bots was assessed [26]. This work discovered that machine learning models, which predict doctors' prescribing behavior, were more effective in targeting than other AI. However, it is evident from the literature that ethical issues like blunting doctors' discretion were a common point of discussion. While AI improves marketing effectiveness, it must be well-regulated.

Step 6: Interpretation of Findings. The thematic analysis revealed several important findings:

AI-Driven Personalization Marketing content personalized through AI enhances communication relevance, enhancing the likelihood of doctors engaging pharmaceutical companies [18].

Predictive Analytics Some AI tools and predictive analytics determine doctors' decision-making, including the types of medication doctors prescribe.

Ethical Considerations Despite this, certain factors must be considered, with the paramount importance placed on ethical issues such as transparency and biases. The

ability to control the masses through AI in marketing strategies needs a proper legal framework to govern the use of AI in healthcare marketing (Fig. 5).

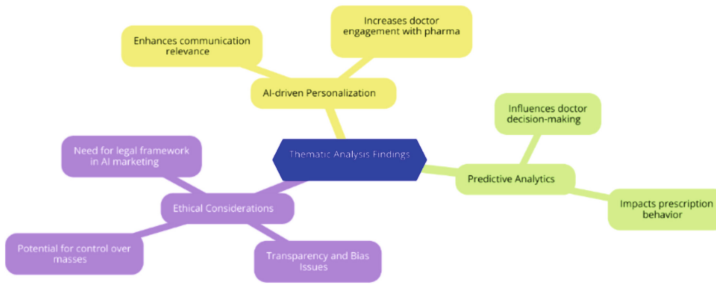


Fig. 5. Ethical Considerations in AI driven Marketing (Self-made).

This is why ethical issues are well under discussion when talking about AI as a tool for digital marketing, especially when applied to the sphere of pharmaceuticals, where doctors' choices influence people's lives directly. The main ethical questions that come with the idea of AI in what more pharma companies are doing with doctors include: In this section, they are going to discover the foremost ethical issues still in AI marketing, geared toward decision-making as well as focusing on privacy, transparency and the bias in the algorithm [10].

Transparency of AI Algorithms. Another key ethical issue when using AI in pharmaceutical marketing is that there usually needs clarity on how the algorithms work. Most AI systems, especially those that use machine learning, can be categorized as black boxes because, most of the time, one cannot fathom the logic behind the recommendations or the decisions the systems make [24]. This is especially the case for personalized marketing content produced by AI systems for doctors depending on their prescribing history, where some of the key elements have not been well defined, leading to ethical problems.

Trust and Informed Decisions. Prescribers use current, qualitatively verified data to make prescription choices [27]. By not making the implemented AI systems in pharmaceutical industries explain them on how they handle the data and produce these recommendations, results may be presented to these healthcare professionals with some bias or with some portions of data left incomplete, in a way that hampers informed decisions being made based on such results.

Potential for Manipulation. Without transparency in the programming code, AI algorithms can be designed to influence doctors' choices regarding certain pharmaceutical products intentionally or unintentionally [17]. As seen from the commercial aspect, this manipulation could involve maloccurrence where dollars preceded patients, which is an awful ethical problem.

Bias in AI Algorithms. The second of the crucial ethical questions is the question of bias in AI algorithms. An AI system is a result of training the system with data, and if

the data set has a biased approach, then it is more likely that such bias can be passed onto the AI system or magnified by the system itself.

Bias in Data. In healthcare discussed here, bias can manifest itself in race, gender, or geographical bias and, therefore, influence the output of an AI system [21]. The doctors may, therefore, receive recommendations based on data influenced by the prescribing patterns of some specific demographic, which will affect the treatment of patients. For example, an AI system designed to work with data from developed countries will not be effective for doctors in underdeveloped areas where the practice and needs of the patients are different.

Commercial Bias. It can also result from bias from pharmaceutical companies since they are vested in the study's outcome. AI systems applied to digital marketing may promote products with the greatest profit margin, or the company may place a lot of emphasis on them, even though these products may be better for the doctor's particular patient congregation. Such commercial predisposition may result in setting up a skewed preference for the prescription of some drugs over others with negative repercussions to the patients [20].

Data Privacy and Consent. Techniques applied in Digital Marketing through Artificial Intelligence involve personal and professional data. Hence, some of the common concerns include the ethical use of data.

Doctor and Patient Data. The primary data used in the pharmaceutical companies' marketing strategies is doctors' prescriptions for certain diseases and drugs [5]. However, patient data is also involved indirectly. Some of the treatment patterns of the doctors being analyzed by the AI systems may contain sensitive information about certain patients and, if not well managed, may result in data leakage. This raises issues about data privacy laws such as the GDPR, which is mandatory for any company that operates within Europe. This regulation insists that personal data must not violate the privacy and confidentiality of individuals.

Informed Consent. Pharmaceutical companies are therefore obliged to make sure that doctors are informed on how their data is collected and used for marketing [32]. AI systems, for example, might identify and evaluate individual prescribing activities without a doctor's permission, thus infringing privacy and ethics standards. Therefore, companies must get informed consent to collect their data, and how it will be used must be explained well to conform to the highest standard of legal and ethical compliance.

Autonomy and Decision-Making. Self-direction by doctors is one of the standards of medical professionalism. The seemingly autonomous digital marketing approaches involving AI-predictive analytics, particularly regarding content type and doctor targeting, appear to exert pressure on doctors' decision-making authority in their profession.

Influence on Prescribing Behavior. Automated recommendations based on a doctor's past prescribing decisions could change the existing defaults, even those derived from self-interest and inimical to patients' interests. For instance, let's consider the rate at which an AI tool recommends certain medications; a doctor may be influenced to favor those medications since the tool repeatedly recommends them instead of opting for more

suitable ones. This brings an ethical issue about the place of AI as an advisor of doctors and the inside-out contradiction when advertising tactics tend to sell products that have more commission than the actual well-being of the patients.

Manipulation Through AI. Doctors' decisions on what medication to prescribe can be predicted and controlled using AI, which is manipulation, especially if the AI system is programmed to guide doctors on what product to recommend. This goes against the norm of non-maleficence, where 'what is permissible is what is not wrong or harmful,' since it might result in the patients receiving substandard treatment guided by the self-profit motive of the practitioners.

Significance Today and in the Future. Hence, implementing AI-driven digital marketing techniques in the pharmaceutical industry is most pertinent today and is expected to take a much larger significance shortly [19]. This advancement is crossing over to various forms of technologies and affecting the relationship between doctors and pharmaceutical firms, and the use of AI will continue to foster this evolution. The sections below discuss different degrees of contemporary application of AI to advance and future-oriented marketing strategy.

4 Relevance to Today

AI is rapidly reshaping the pharmaceutical marketing landscape, offering several advantages that make it particularly relevant in today's digital world: AI is rapidly reshaping the pharmaceutical marketing landscape, offering several advantages that make it particularly relevant in today's digital world:

Personalization and Targeting. As personal communication media have evolved, pharma enterprises are utilizing AI to provide targeted marketing material to physicians. These targeted initiatives have been influenced by prescribing behavior, medical specialty, and the clients' characteristics of specific doctors. AI enables pharmaceutical companies to understand massive amounts of data to better address healthcare professionals' needs, compelling their attention to marketing messages.

Increased Digitalization in Healthcare. The effect of the COVID-19 pandemic was, therefore, quickening the pace of technology adoption in the marketing of pharmaceutical products [28]. As the meetings between doctors and representatives of the pharmaceuticals moved from physical contact, there was the need to engage virtually. Due to the advancement in the use of AI in the medical field, doctors are well-informed about new drugs and treatments, and AI makes these virtual interactions possible. This trend of digital engagement has been observed, and the future of the future is expected to go further with the help of AI to establish a closer link between pharmaceutical companies and doctors.

Efficiency and Cost Savings Realizing that hit-and-miss marketing methods are costly and time-consuming, applying artificial intelligence in marketing saves on cost-effective measures such as one-on-one sales meetings and marketing conferences [15]. This is especially important in mass marketing events like email marketing with chatbot or,

more specifically, customized product offerings for diseases for which pharmaceutical companies would like to target more doctors with less effort and costs involved. Such an approach particularly applies to the industry where marketing costs are significant.

4.1 Future Relevance

AI is poised to transform pharmaceutical marketing with several key trends further [29].

Enhanced Personalization. Marketing content will be more relevant since machine learning, deep learning, and other forms of AI can provide more real-time data and better marketing personalization that can be used to target doctors better based on their needs, medical research, and patients' results.

AI-Powered Virtual Assistants. Virtual assistants could give doctors instant evidence-based information on treatments and new drugs within a relatively shorter period, with doctors being more interactive with the companies [16].

Ethical and Regulatory Changes. Future updates to these guidelines will focus on issues related to algorithmic transparency, biased AI-driven recommendation systems, and data protection for healthcare marketing.

Focus on Patient Outcomes. Machine learning and other forms of artificial intelligence will move from advertising a product to delivering beneficial patient results by offering physicians data analyzing tools and outcomes.

Global Expansion. Thus, as AI advances make their way into the market, it will assist pharmaceutical companies in reaching new doctors, especially in rural areas, enhancing healthcare delivery in areas of need.

5 Discussion

This research highlights AI-driven digital marketing as the transformative force for pharmaceutical consumer behavior. AI technologies within machine learning and predictive analytics allow personalization of the marketing effort, making engagements with healthcare professionals more effective by the pharmaceutical firms. AI-fueled marketing strategies are significantly affecting doctors' decisions regarding the prescriptions made according to recommendations from their peers, based on their own prescription patterns, and in consideration of their medical specializations. Ethical challenges arise nevertheless. An important issue remains regarding transparency of the AI algorithms, which the doctor would barely understand in recommending patients. There are also issues of privacy related to this data collection of sensitive information on a massive scale. Others might reasonably argue that any algorithmic bias might in fact prioritize commercial interests at the expense of clinical efficacy; arguably, that might tilt the playing field in favor of influencing the prescribing behaviors of doctors. On a rather practical level, by essentially diffusing access to pharmaceutical marketing information, AI marketing might constrain the free and autonomous decision-making of doctors. Nonetheless, overemphasis on AI will lessen the importance of human independent clinical judgment. Quite appropriately, one prime objective here is to uphold ethical usage of AI to preserve the integrity of medical decision-making.

6 Conclusion

The study also suggests that, with the rise of digital marketing powered by artificial intelligence, the way doctors engage with pharmaceutical firms has been altered completely. In this way, AI optimizes the efforts of organizations and improves patient engagement, as well as more rational prescribing activity due to the application of accurate recommendations based on scientific evidence. These innovations are expected to improve the level of accommodating the targeted promotional material with patient needs and wants to increase healthcare professional receptiveness. However, in artificial intelligence there remains large ethical issues associated with the higher use such as transparency, data privacy, and any unfair bias in the relation of algorithms with strategies. Solving these problems is important to enhance the confidence of and properly regulate the application of AI tools in promoting health care services. The key zones where these technologies can operate will define the working option of applying the AI's possibilities and the presence of ethical standards for using intelligent technologies in the future of the pharmaceutical industry. Based on the development trajectory of AI technology, more possibilities are to be seen for AI in pharmaceutical marketing strategies and to enhance the assistance of health care providers. However, ethical governance must remain a priority, to protect and reinforce the trust in these new technologies, and keep AI innovation from becoming elastic and menacing in its erosion of basic values. It is safe to say that the future of healthcare marketing will lie in how technologic innovation will be utilized in parallel with an ethical foundation.

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