





## Review

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# DIGITAL TRANSFORMATION OF CLINICAL EDUCATION THROUGH ARTIFICIAL INTELLIGENCE: A STRENGTHS, WEAKNESSES, OPPORTUNITIES, AND THREATS (SWOT) ANALYSIS

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## Abstract

This review article examines the impact of Artificial Intelligence (AI) on the digital transformation of clinical education through a comprehensive SWOT (strengths, weaknesses, opportunities, and threats) analysis. AI offers several strengths, including innovative learning strategies through simulations and virtual patients, personalized learning paths, advanced clinical training, and enhanced communication skills. However, AI faces weaknesses such as a lack of transparency, potential for misinformation, limited curriculum integration, and access inequality. Opportunities include managing information overload, providing real-time feedback, supporting multiple languages, and generating clinical scenarios. Threats include misinformation and bias, overdependence on AI, privacy concerns, lack of human interaction, and access inequality. Addressing these challenges is critical to fully realize AI's potential in medical education.

**Keywords:** Artificial intelligence, medical education, digital health, clinical skills, patient simulation.

## Introduction

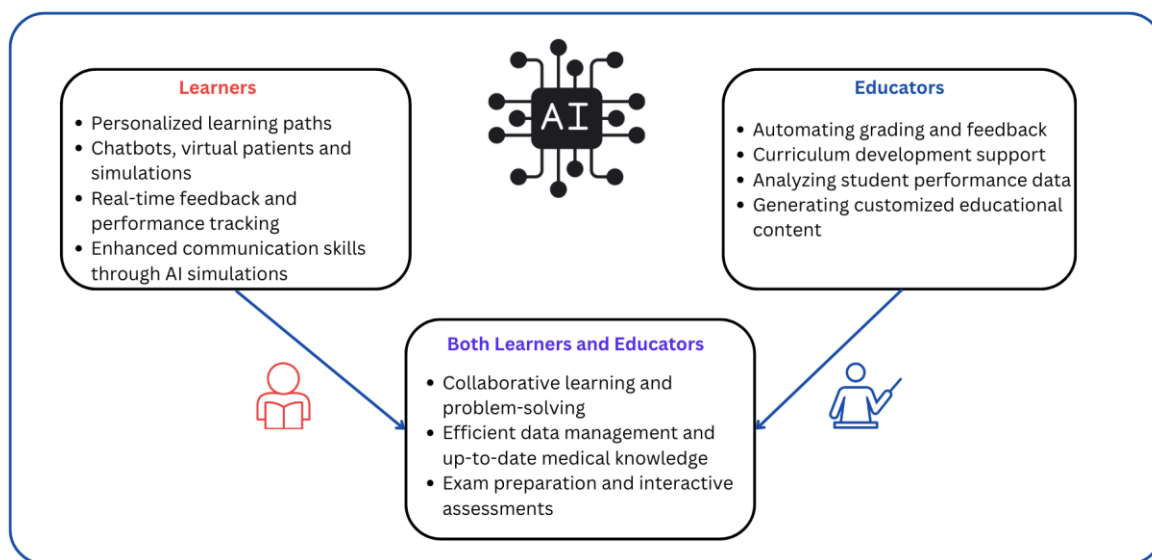
Traditional medical education often follows a teacher-centric approach, where content and learning pace are primarily determined by instructors, leading to passive student engagement and limited personalization. Integrating artificial intelligence (AI) in medical education revolutionizes traditional learning methods by offering innovative solutions that enable more personalized and efficient medical education.<sup>1</sup> (Table 1)

**Table 1.** Comparison of Traditional vs. AI-Driven Medical Education Methods

Aspect	Traditional Methods	AI-Driven Methods
<b>Scalability</b>	Limited to classroom size and instructor availability	Highly scalable across large groups with flexible access
<b>Personalization</b>	One-size-fits-all approach with limited customization	Tailored learning paths based on individual student needs
<b>Feedback</b>	Delayed and dependent on educator availability	Real-time, automated feedback through AI systems
<b>Access to Diverse Scenarios</b>	Limited exposure to rare cases due to resource constraints	Ability to simulate rare, complex, and diverse cases
<b>Accessibility by Students</b>	Restricted by location and time; in-person attendance required	Accessible anytime, anywhere with internet access, supporting flexible learning
<b>Interactivity and Engagement</b>	Primarily passive learning through lectures	Highly interactive, immersive learning experiences through simulations and virtual patients
<b>Availability of Resources</b>	Limited by faculty availability and physical resources	Vast digital resources accessible to students at their convenience

AI enhances knowledge acquisition, skill development, and understanding of complex medical concepts through personalized learning paths, real-time feedback, and immersive simulations of clinical scenarios for learners. AI tools streamline curriculum development, automate grading and assessments, and offer data-

driven insights into student performance, allowing for more targeted and effective teaching strategies for educators.<sup>2,3</sup> (Figure 1)



**Figure 1.** AI Applications in Medical Education for Learners and Educators

As conversational agents, chatbots have become increasingly prominent in medical education, offering students instant access to information, personalized guidance, and interactive learning experiences that complement traditional teaching methods. These chatbots can be designed to follow predetermined flows (rule-based) or be powered by AI.<sup>4</sup> Traditional rule-based chatbots have been used in medicine for several years, primarily offering scripted responses and limited interaction capabilities. However, the advent of AI and large language models (LLMs) marked a significant leap forward.<sup>5</sup> LLMs are advanced AI systems trained on extensive datasets, including vast amounts of online content, enabling them to generate natural, human-like text and other outputs. These models, with their sophisticated natural language processing (NLP) capabilities, are precious in medical education.<sup>6</sup> Widely known LLMs include ChatGPT (OpenAI), Palm (Google), and LLaMA (Meta).<sup>7</sup> These models have been increasingly integrated into healthcare to provide general information, support decision-making, aid in diagnostic processes, improve practical skills, and evaluate student performance; however, further research with rigorous validation is needed to identify the most effective AI tools for medical education.<sup>8</sup> Ai-driven educational chatbots, often deployed online, offer an innovative approach to delivering education by providing instant responses and engaging students in interactive learning activities.<sup>9</sup> This personalized interaction enhances the learning experience and allows educators to focus more on curriculum development and research, thus promoting a more efficient and effective educational process.<sup>10</sup>

Simulations and virtual patients (VPs) are critical components in modern medical training.<sup>11,12</sup> They provide a controlled, interactive environment where students can practice clinical skills. AI-driven technologies, such as NLP and machine learning, enable the creation of sophisticated virtual patients that can mimic real-life patient interactions. These tools are precious in enhancing diagnostic skills and improving patient communication.<sup>13</sup> In these simulations, learners act as healthcare providers, gathering information, suggesting diagnoses, and managing patient care. Virtual patients allow medical students to practice communication and clinical reasoning skills in an immersive, interactive environment that replicates real-life medical scenarios.<sup>3</sup>

This article aims to explore the impact of AI on the digital transformation of clinical education by conducting a comprehensive SWOT (strengths, weaknesses, opportunities, and threats) analysis, focusing on how AI-driven tools enhance personalized medical training, address current educational challenges, and shape the future of healthcare learning environments.

## Materials and Methods

To establish a comprehensive foundation for the SWOT analysis on the transformation of clinical education through artificial intelligence, an exhaustive literature review was conducted using PubMed. The search was performed in PubMed using the query [Title/Abstract]: (medical education) OR (medical training) AND (artificial intelligence). This search strategy yielded 737 relevant articles. The articles were screened based on relevance to the intersection of medical education and artificial intelligence. Articles that were outdated or did not contribute significantly to the focus of the study were excluded. Key information, including significant findings, theoretical frameworks, and pertinent factors for the SWOT analysis, was systematically extracted from the selected articles. The extracted data was critically analyzed and categorized into the SWOT themes strengths, weaknesses, opportunities, and threats. This synthesis facilitated the identification of primary factors influencing the integration of AI in clinical education.

## SWOT Analysis

The key points of the SWOT analysis for AI in medical education are presented in Table 2.

**Table 2.** The key points of SWOT analysis for AI in medical education

Strengths	Opportunities
<ul style="list-style-type: none"> <li>- New Education Strategies: AI Simulation and VPs</li> <li>- Personalized Medical Education</li> <li>- Advanced Clinical Training and Skill Development</li> <li>- Enhanced Communication Skills</li> <li>- Assisting Exam Preparation</li> <li>- Accessibility and Equality</li> </ul>	<ul style="list-style-type: none"> <li>- Management of Information Overload</li> <li>- Multidisciplinary Approach</li> <li>- Multi-Language Support</li> <li>- Clinical Scenario Generation</li> <li>- Real-Time Feedback</li> <li>- Retrieval-Augmented Generation (RAG)</li> </ul>
Weaknesses	Threats
<ul style="list-style-type: none"> <li>- Black Box Against Transparency</li> <li>- Artificial Hallucination and Inaccurate Citation</li> <li>- Limited Up-to-Date Information</li> <li>- Limited Integration in the Medical Curriculum</li> <li>- Limited Evaluation in Specific Areas</li> </ul>	<ul style="list-style-type: none"> <li>- Bias and Misinformation</li> <li>- Overdependence</li> <li>- Privacy and Ethical Concerns</li> <li>- Lack of Human Interaction and Emotions</li> <li>- Access Inequality</li> </ul>

### Strengths

#### *Novel Learning Strategies: AI-powered Simulation and Virtual Patients*

Integrating AI in simulation-based education offers innovative learning strategies that are transforming medical training. AI-driven simulations, including high-fidelity mannequins and virtual patients, have proven essential in enhancing safety and quality across various industries, especially healthcare.<sup>14</sup> These simulations can replicate real-life scenarios, including rare and complex cases, allowing students to practice repeatedly without posing risks to real patients. Immediate feedback these simulations provide further supports skill development and knowledge retention.<sup>15</sup>

For instance, a study utilizing a 'no-code' generative AI platform to create virtual patient avatars found that 87% of trainees rated the tool as intuitive and accurate, highlighting its potential for specialized medical training.<sup>16</sup> The ability to tailor these simulations to specific medical specialties provides realistic practice scenarios that enhance learning outcomes. In dental education, AI tools are increasingly used to refine procedural training and improve diagnostic accuracy, offering a controlled and safe environment for students to hone their skills.<sup>15</sup> In surgical training, AI-enhanced simulations, such as robot-assisted surgery training and virtual reality platforms, allow students to master complex techniques and decision-making skills, effectively preparing them for real-world surgical procedures.<sup>17</sup> Radiology education also benefits significantly from AI, with AI-powered systems assisting in image interpretation pattern recognition and providing automated feedback to trainees, thereby improving diagnostic skills and clinical readiness.<sup>18</sup> These advancements underscore the transformative potential of AI in medical education, offering personalized, immersive, and compelling learning experiences across diverse medical fields. The continued integration of AI-driven simulations will be critical in shaping the future of healthcare training.

AI-driven gamification is increasingly recognized as an effective tool in medical education, combining game elements like rewards and challenges with immersive learning. For example, a pilot study using virtual reality (VR) and gamification for training new nurses on responding to respiratory decline in infants showed promising results, with learners responding better to VR compared to traditional methods.<sup>19</sup>

#### *Personalised Medical Education*

AI tools are crucial in personalized medical education by adapting to each student's unique learning needs and pace, offering a more tailored and practical learning experience.<sup>20</sup> For instance, AI-driven platforms like ChatGPT can be utilized to create virtual tutors or assistants that provide personalized support by answering questions and helping with homework. This addresses the challenge teachers often face in designing study plans and learning resources that cater to students' diverse learning styles and abilities within a classroom environment.<sup>21</sup> The personalized approach AI offers can significantly enhance educational outcomes by providing more engaging learning experiences that are responsive to individual needs. A systematic review found that chatbots in education can effectively personalize learning activities, support educators, and gain deep insights into students' learning behaviours. Additionally, ChatGPT's ability to tailor content to individual learners facilitates a more interactive and practical learning environment, enabling students to understand complex medical concepts better and apply them in clinical practice.<sup>4,22</sup>

### *Advanced Clinical Training and Skill Development*

AI integration in medical education has improved diagnostic accuracy and procedural skills, with chatbots like ChatGPT demonstrating high levels of consistency and insightful explanations. These capabilities make them valuable resources for medical education and clinical decision-making.<sup>4,23</sup>

While effective, traditional standardized patient (SP) encounters are often costly and time-intensive. The rise of telemedicine and virtual SP encounters presents a more accessible and efficient alternative, enabling residents to practice clinical skills in a controlled and simulated environment. AI-driven simulations further enhance these opportunities by providing scalable, cost-effective training tailored to meet individual learning needs, ultimately improving the quality and accessibility of medical education.<sup>24</sup>

Moreover, AI simulations are instrumental in training students to manage patients with undifferentiated symptoms where the diagnosis is not immediately clear. This capability is crucial for developing the skills to conduct thorough assessments and consider multiple potential diagnoses.<sup>13,25</sup>

Additionally, recent research, such as a 2023 protocol focused on AI in wound care education, underscores the importance of leveraging AI to optimize patient outcomes through enhanced educational strategies.<sup>26</sup> Exposure to various clinical conditions through AI-powered simulations can help bridge training gaps and improve students' diagnostic skills, better preparing them for real-world medical challenges.

### *Enhancing Communication Skills*

The importance of diverse communication strategies in medical education cannot be overstated, particularly when training involves interactions with varied patient personalities. Research consistently shows that communication skills are a core physician competency that directly influences patient outcomes, including recall, adherence to therapy, and overall patient satisfaction.<sup>27</sup> AI simulations provide diverse and realistic case scenarios, offering students opportunities to improve their communication skills while practicing clinical decision-making.<sup>28</sup> Through AI-simulated patients, learners can engage in authentic clinical interactions, allowing them to effectively develop their bedside manner and patient engagement strategies. Research has shown that VPs are particularly useful in enhancing communication skills, including nonverbal communication, by responding dynamically to users' emotional states and promoting deeper engagement.<sup>29</sup>

A recent study explored the innovative use of AI chatbots, specifically ChatGPT, in training physicians to deliver bad news—a critical skill in fields like emergency medicine. By offering detailed prompts to the AI chatbot, educators were able to create realistic clinical scenarios, facilitate active roleplay, and provide real-time feedback to trainees. The results demonstrated that ChatGPT could successfully simulate a training



environment using the SPIKES framework for delivering bad news and offering clear and structured feedback. This proof-of-concept study highlights the significant potential of AI chatbot technology to contribute to graduate medical education by offering new opportunities for skill development and interactive learning.<sup>30</sup>

#### *Accessibility and Equality in Medical Education*

AI-driven technologies have the potential to bridge gaps in accessibility and promote educational equality in medical training. The rise of telemedicine encounters provides a more accessible and efficient alternative to traditional clinical training, allowing residents to practice clinical skills in a controlled, simulated environment. This approach is particularly beneficial when access to physical training resources is limited. A comprehensive review of 80 articles highlights that educational chatbots have been successfully applied in diverse fields such as health advocacy, language learning, and self-advocacy.<sup>31</sup> Studies indicate that chatbots enhance student engagement and motivation and provide immediate, personalized assistance, making education more inclusive and accessible. Their applications extend beyond basic interactions, offering features like answering frequently asked questions, conducting short quizzes, providing scaffolding, and recommending targeted learning activities.<sup>4</sup> Furthermore, AI tools can be instrumental in patient education by creating customized, easy-to-understand materials tailored to different literacy levels and languages. By improving both clinical training and patient education, these advancements offer a pathway to more efficient and effective healthcare delivery.<sup>32</sup> By offering these capabilities, AI tools ensure that learners from various backgrounds can access high-quality educational resources, contributing to a more equitable learning environment.

#### *Assisting Exam Preparation*

AI-driven tools like chatbots and language models have shown the potential to support medical students' exam preparation and performance. Although current chatbots are still limited in consistently generating reliable board-style questions and clinical assessments, future developments could focus on creating customizable clinical vignettes that mimic USMLE or specialty exam formats. These tools would provide interactive, real-time feedback, helping students identify areas of strength and weakness.<sup>32</sup> For instance, studies have demonstrated that ChatGPT can perform at or near the passing threshold for the USMLE, indicating its utility in preparing for high-stakes exams.<sup>23</sup> Additionally, ChatGPT has been tested on advanced specialty exams and performed successfully, showing its capability in postgraduate education as well.<sup>33</sup> The tool has also proven useful for undergraduate medical education, particularly in addressing higher-order reasoning questions in subjects like biochemistry.<sup>34</sup> (4). Beyond traditional exams, ChatGPT supports continuous medical education for practicing clinicians by offering up-to-date, evidence-based information to enhance decision-making and patient care.<sup>35</sup> Furthermore, the platform facilitates self-directed learning by adapting to students' needs, guiding them through complex scenarios, and reinforcing understanding through conversations.<sup>36,37</sup>

## Weaknesses

### *Blackbox Against Transparency*

One of the primary concerns with AI in education is the "black box" nature of these technologies, particularly with deep learning models.<sup>38</sup> These systems often lack transparency in their decision-making processes, making it difficult for users to understand how specific conclusions are reached. This lack of clarity can lead to frustration and discomfort, as students and educators cannot verify the reasoning behind specific outputs or decisions. In educational contexts, where transparency and trust are crucial for creating a positive learning environment, without insight into why an AI system arrived at a particular conclusion, students may struggle to trust the feedback, which can diminish the educational value and overall effectiveness of these technologies.<sup>17,39</sup> (2, 3). For AI to be fully integrated into education, especially in fields like medicine, it is essential to prioritize transparency, ensuring that users can understand and validate the underlying processes that inform AI-generated outcomes.

### *Artificial Hallucination and Inaccurate Citation*

One of the key weaknesses of AI in medical education is the occurrence of "artificial hallucination," where AI systems generate responses that are either factually incorrect or entirely fabricated while delivering them with a high degree of confidence.<sup>40</sup> These misleading outputs can be particularly problematic because they are often presented convincingly, making it difficult for users to distinguish between correct and erroneous content. This risk becomes significant when students rely heavily on AI-generated information, potentially leading to the spread of inaccuracies in their learning. Additionally, AI-powered chatbots face challenges in providing reliable citations. The tendency of some AI systems to produce fabricated references or incomplete sources undermines academic integrity and poses risks to students who may unknowingly incorporate false information into their work.<sup>32</sup> For AI to be more effective in educational settings, it must be equipped to reference credible, evidence-based sources consistently. To mitigate these risks, AI tools should be designed to adhere to ethical and scientific standards, ensuring the accuracy of their outputs.

### *Lack of up-to-date information*

A significant weakness of current AI technologies, including chatbots and large language models like GPT-4, is their reliance on static datasets. These models are trained on data that is current only up to a specific cutoff date, meaning they do not have access to the latest research or developments that occur after their last update. This limitation generates outdated or scientifically inaccurate information, which can be problematic in fields like medicine, where staying up-to-date is critical. Therefore, AI-generated content must be carefully reviewed and verified before use to avoid disseminating obsolete or incorrect information.<sup>41</sup>

### *Limited Integration of AI in Medical Curriculum*

Despite the growing relevance of AI in healthcare, it remains underrepresented in the medical curriculum, giving students limited opportunities to deeply engage with the subject and develop essential expertise.<sup>42</sup> Dartmouth Medical School has introduced an AI patient app to help students practice interviewing skills, demonstrating how AI can enhance traditional medical education methods.<sup>43</sup> A multi-center study conducted in Turkey revealed that while most medical students perceive AI as a tool that could improve access to healthcare and reduce errors, only 6% felt competent to inform patients about AI applications, highlighting significant educational gaps. The study emphasized the urgent need to restructure medical curricula to equip future physicians with the knowledge and skills necessary for effectively using AI while addressing ethical concerns and preserving professional values.<sup>44</sup> While some institutions have made strides in incorporating AI into their programs, such initiatives are still not widespread. A recent study outlined key competencies that medical graduates need to be prepared for the implications of AI, further emphasizing the importance of integrating AI education into medical curricula.<sup>45</sup> To fully prepare the next generation of healthcare professionals, medical education must evolve to include comprehensive AI training, ensuring that students are equipped with the knowledge and skills necessary to navigate an increasingly technology-driven healthcare environment.

### *Limited Evaluation in Specific Areas*

While AI is promising to transform medical education, its evaluation and effectiveness in certain areas remain limited. For instance, Project TOUCH integrates advanced technologies like virtual reality and AI to enhance problem-based learning in medical education.<sup>46</sup> However, the study primarily focused on an ongoing project. It lacked empirical data comparing the effectiveness of AI-enhanced virtual patient simulations to traditional paper-based case tutorials, revealing a significant research gap.<sup>47</sup> Moreover, despite advancements in AI simulations in specialized fields such as surgery and dentistry, primary care has yet to see widespread adoption of these technologies. Expanding AI simulations into primary care could provide substantial benefits, such as improving training for common conditions and enhancing diagnostic accuracy. By simulating complex and undifferentiated patient scenarios, AI can help students develop well-rounded clinical skills and better prepare for real-world practice.<sup>48</sup> Addressing these evaluation gaps is crucial for the broader implementation and optimization of AI tools across various medical disciplines.

## Opportunities

### *Management of Information Overload*

In today's rapidly evolving medical landscape, the sheer volume of medical information is expanding at an unprecedented rate, making it increasingly difficult for healthcare professionals to stay updated. AI has the potential to alleviate these challenges by efficiently processing large amounts of data and supporting physicians in making informed decisions.<sup>8</sup> Integrating LLMs into medical education offers real-time, interactive access to vast reservoirs of medical knowledge tailored to the learner's level. These tools assist in answering clinical questions, suggesting differential diagnoses, generating educational materials, and enhancing the understanding of complex medical concepts.<sup>49</sup> Given the challenge of staying current with rapidly advancing medical literature, LLM tools like ChatGPT can integrate AI text classifiers to help students and educators quickly identify relevant research, categorize extensive scientific data, and generate concise summaries. These features support continuous learning and ignite interest in specific research areas. Furthermore, chatbots offer personalized assistance by acting as interactive tutors, guiding students through challenging concepts, automating the creation of study materials such as flashcards, and developing memory aids like mnemonics. This personalized support enhances active recall and retention of key information, making AI a powerful tool in modern medical education.<sup>32</sup>

### *Realtime Feedback*

AI-powered educational platforms are revolutionizing how feedback is delivered in medical training by providing real-time, automated insights crucial for skill development. One such example is the Virtual Operative Assistant, an educational tool designed to offer automated feedback on surgical performance by aligning with expert proficiency benchmarks. This system has shown high accuracy, specificity, and sensitivity in distinguishing between skilled and novice participants during neurosurgical tasks, making it an effective formative tool in surgical education.<sup>17</sup> Combining expertise classification, objective feedback, and instructor input creates a comprehensive learning environment that supports the integration of AI and virtual reality simulations in medical education. Future advancements in this area will likely refine these feedback systems and broaden their application across various levels of medical expertise.

Additionally, AI-driven intelligent tutoring systems (ITSs) are increasingly used in medical education to mimic the benefits of one-on-one human tutoring. These systems analyze extensive data related to a student's performance, learning style, and progress, allowing them to identify gaps in knowledge and provide personalized learning experiences. ITSs can adapt their teaching strategies in real-time, offering customized feedback, diagnosing strengths and weaknesses, curating relevant learning materials, and facilitating collaborative learning among students.<sup>3</sup> By emulating the behaviour of skilled human tutors, AI-based ITSs

enhance the learning process, making medical education more responsive and tailored to individual needs. The continued integration of real-time AI-driven feedback systems in medical education promises to create more personalized, effective, and adaptive learning experiences that can significantly improve both knowledge acquisition and skill mastery.

#### *Multi-language support*

One of the key strengths of generative AI tools is their ability to support multiple languages, significantly improving accessibility for non-native English speakers. These tools can communicate in several languages beyond English, offering a more inclusive learning environment compared to earlier chatbots. However, the effectiveness of this multi-language capability varies depending on the quality and quantity of training data available for each language.<sup>50</sup> By facilitating translation and correction of scholarly work, AI tools help reduce language barriers, allowing research from non-native English-speaking countries to be evaluated more equitably alongside work from native speakers.<sup>51</sup> This enhanced accessibility contributes to a more diverse and inclusive academic environment, ensuring that language differences do not hinder global collaboration and knowledge-sharing in medical education.<sup>52</sup>

#### *Clinical Scenario Generation*

AI-generated clinical case vignettes present a promising opportunity to streamline the creation of diverse and inclusive medical training scenarios. Traditionally, developing clinical vignettes has been resource-intensive and time-consuming, requiring significant expertise. However, with the advent of AI tools like ChatGPT and image generators, educators can now automate the production of a wide variety of clinical scenarios that are both realistic and customizable, significantly reducing costs and time.<sup>53</sup> This capability allows for the rapid generation of large volumes of clinical vignettes that better represent varied patient populations, addressing common biases and enhancing the realism of medical education.<sup>21</sup> Moreover, research has demonstrated the effectiveness of AI in creating realistic virtual standardized patient dialogues. For example, studies focusing on scenarios like prenatal counseling have shown that AI can expand virtual patient programs by generating diverse and engaging patient interactions that improve the quality of medical training.<sup>54</sup> By leveraging AI in clinical scenario generation, educators can provide students with broader clinical experiences, better preparing them for real-world decision-making and patient care.

#### *Citation-Based Response Generation*

While current AI-driven chatbots still face limitations due to their reliance on diverse internet sources, they hold significant potential for future refinement in clinical applications. AI-powered tools could be enhanced to deliver evidence-based, scenario-specific information in a conversational format, making complex medical

concepts more accessible and supporting better clinical decision-making.<sup>32</sup> These tools can also serve as quick references for medication guidelines, drug interactions, and treatment protocols, streamlining the learning process for students. As chatbots become more integrated with electronic medical records, they could assist in generating consistent medical documentation while still encouraging critical thinking and decision-making skills among students. The development of citation-based response generation within AI tools can lead to more accurate, reliable, and educationally beneficial resources for both students and educators.

#### *Retrieval-augmented generation (RAG)*

The integration of advanced AI techniques like retrieval-augmented generation (RAG) offers significant benefits in medical education by improving both the accuracy and relevance of AI-generated content. Unlike traditional models that rely solely on pre-existing training data, RAG retrieves information from external databases before generating responses, grounding its output in the most up-to-date and verified sources. This reduces the risk of AI hallucinations, ensuring students receive accurate and reliable information.<sup>55</sup> By incorporating RAG, educators can enhance learning experiences with detailed, real-world case studies that are directly relevant to complex medical topics like electrolyte imbalances in chronic kidney disease (CKD). Accessing current case reports and clinical scenarios enriches the curriculum, making it more interactive, evidence-based, and aligned with current medical practices.<sup>56</sup> As a result, students are better equipped to apply theoretical knowledge in real-world contexts, thereby enhancing their preparedness for medical careers.

#### *Multidisciplinary Approach*

In medical education, fostering a multidisciplinary perspective is crucial for preparing healthcare professionals to navigate complex, real-world scenarios. RAG's ability to draw insights from various medical disciplines makes it a valuable tool for this purpose. For example, when teaching conditions like chronic obstructive pulmonary disease (COPD) complicated by heart failure, RAG can integrate knowledge from pulmonology, cardiology, and pharmacology, providing a comprehensive understanding of how different body systems interact. This holistic approach helps students appreciate the importance of interdisciplinary collaboration in patient care, enhancing their critical thinking and decision-making skills. By incorporating multiple perspectives into case-based learning, educators can prepare students to manage complex cases effectively and develop the collaborative mindset necessary in modern healthcare.<sup>56</sup>

## Threats

### *Misinformation and Bias*

One of the significant threats associated with AI models in medical education is the potential for misinformation and algorithmic bias. AI models, including LLMs like GPT-4, are often trained on datasets that may inherently contain biases, reinforcing stereotypes and social biases. These biases can have serious implications for medical education, affecting the quality and fairness of student training.<sup>21</sup> Ensuring that AI models are trained on diverse and accurate datasets and incorporating rigorous validation mechanisms are crucial to mitigating these risks. Addressing misinformation and bias is essential to fully realize the benefits of AI in medical education while minimizing potential harm.<sup>50,57</sup>

### *Overdependence*

Overreliance on AI models in medical education presents a significant threat, especially when misinformation is convincingly delivered. Despite ongoing advancements, models like GPT-4 can still generate incorrect or misleading information, which poses a risk if students and educators accept these outputs without proper verification.<sup>16</sup> This dependence on AI tools can undermine the development of essential skills in medical students, such as critical thinking, problem-solving, and effective communication. The convenience of AI-provided answers might reduce students' motivation to engage in independent research and draw their conclusions. As a result, students could miss opportunities to cultivate analytical skills that are crucial in medical practice.<sup>50</sup>

### *Privacy and Ethical Concerns*

The development of AI algorithms typically requires vast amounts of data, raising ethical issues related to patient consent, data privacy, and security. In particular, handling sensitive patient data in educational contexts introduces complex challenges that demand strict adherence to regulatory and ethical guidelines. Privacy concerns extend to the risks associated with AI's ability to manage sensitive student and patient data, which could lead to significant data breaches or misuse if not properly managed.<sup>8</sup> Safeguarding patient privacy requires robust data protection measures and strict regulatory compliance. Additionally, the potential for AI to generate errors or biases in data presents a unique challenge, as these mistakes could impact both educational content and clinical decision-making.<sup>58</sup>

Another key ethical issue is the balance between AI-driven efficiency and human oversight. While AI offers substantial benefits in automating educational processes, there remains a critical need for human verification and the ability to identify and correct errors generated by AI systems. Ensuring transparency, accountability, and the ethical use of AI tools necessitates establishing clear guidelines and regulatory frameworks. This includes addressing the risks of algorithmic bias, ensuring data accuracy, and maintaining the ethical standards that underpin medical education.<sup>1</sup> Addressing these privacy and ethical challenges is crucial to ensuring the responsible use of AI in medical education while maintaining trust and safeguarding data integrity.<sup>50</sup>

#### *Lack of Human Interaction and Emotions*

AI applications often lack the human element essential in healthcare, particularly in understanding and responding to emotional reasoning, which is crucial in medical education and patient interactions. Current LLMs, while advanced, are limited to textual interfaces and are unable to recognize physical gestures or movements, nor can they convey emotions.<sup>50</sup> This absence of human interaction can harm students who value personal connections with educators. Studies, such as one conducted by D'Mello and colleagues, have shown that students who engaged with virtual tutors that mimicked human-like emotional behaviour achieved better learning outcomes than those who interacted with emotionless virtual tutors. The challenge of humanizing generative AI tools—to provide accurate responses and exhibit emotions and a distinctive personality—remains significant.<sup>59</sup>

#### *Access Inequality*

Despite the potential benefits of AI in education, access to these tools is not universally equitable. Students from disadvantaged backgrounds, those with disabilities, or those who are not proficient in English often face significant barriers to benefiting from AI-enhanced education. These disparities risk widening the educational gap, particularly as AI tools become more integrated into learning environments.<sup>57</sup> LLMs offer multilingual support, but their effectiveness varies depending on the language and the availability of high-quality training data. This variation makes these tools less accessible to non-English speakers, limiting their usefulness for a global audience. Additionally, limited internet access, high subscription costs, and a lack of familiarity with technology can disproportionately affect students from lower-income backgrounds or underfunded institutions.<sup>50</sup> A recently developed scale, the Medical Artificial Intelligence Readiness Scale for Medical Students (MAIRS-MS), could serve as a valuable tool to assess and address these gaps, providing a foundation for more equitable AI integration in education.<sup>60</sup>



### *Limitations*

This review article primarily draws on existing literature and case studies to analyze the integration of AI in medical education. However, the rapidly evolving nature of AI technologies presents a challenge, as newer tools and updates may quickly outdated some of the findings and discussions. Additionally, while the article covers a broad range of AI applications, it does not delve deeply into the long-term effects of AI integration on student outcomes, as comprehensive longitudinal studies are still limited.

In conclusion, the findings of this study align with prior reviews in highlighting the transformative potential of AI in medical education, particularly in areas such as personalized learning, enhanced accessibility, and real-time feedback. Similar to previous studies, our analysis underscores the significance of AI-driven simulations and VPs in bridging gaps in traditional educational methods. However, this study diverges in its emphasis on the challenges specific to integrating AI in medical curricula, particularly the limited adoption in low-resource settings and primary care training, which were less explored in previous reviews. Incorporating a SWOT framework offers a structured lens to compare strengths and limitations, providing unique insights into balancing AI's benefits and risks in educational contexts. These findings extend prior research by contextualizing AI's impact within the evolving needs of multidisciplinary healthcare education, particularly emphasizing equitable access and curriculum integration.

In conclusion, integrating AI into medical education offers transformative potential by addressing longstanding challenges, enhancing learning experiences, and providing personalized educational pathways for learners and educators. Students can use AI-powered simulations, real-time feedback systems, and advanced data management to engage in more interactive and effective learning environments. However, successfully implementing these tools requires overcoming significant challenges, including issues related to transparency, misinformation, equity, and ethical considerations. As AI technologies continue to evolve, a balanced approach that leverages their strengths while addressing their limitations is essential for shaping the future of medical education. Ongoing research, collaboration, and strategic regulation will ensure that AI-driven education delivers its full potential while maintaining the core values of medical training and patient care.

**Ethical Considerations:** As this is a review article based on existing literature, ethical considerations related to human or animal research do not apply.

**Conflict of Interest:** The authors declare no conflict of interest.

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