Application of large language models in dental education: a review of literature

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Running Title: Large language models in dental education

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ABSTRACT

Background: The recent emergence of artificial intelligence and Large Language Models (LLMs) has caused educators to be cautious about applying these technologies in education. This narrative review explores the current literature to identify the existing applications of LLMs in dental education. Methods: An extensive literature search on PubMed, CINAHL Plus, and Education Research Complete was conducted. The search string was (((Large language model) OR (Chatbot)) OR (ChatGPT)) AND (Dental education). Primary research articles published in English and relevant to our research questions were included. Articles were screened by the title and then by full-text review. Data were extracted from the eligible studies. Results: After two rounds of screening, 28 articles were included in the review. The LLMs used in the studies included ChatGPT versions 3, 3.5, 4, 40, 4V, Bing Chat, Bard, Gemini, Copilot, Llama 2, Claude3-Opus and custom chatbots developed by the authors. Extraction and analysis of the data revealed two major themes in the ongoing research: (i) Assessing the performance of LLMs on standardized exams and (ii) Assessing LLMs as teaching tools. Discussion: Many studies reported that LLMs can successfully pass high-stakes dental exams, raising concerns about the current assessment methods. However, findings that LLMs perform poorly in critically appraising literature and interpretation-type questions are insightful for educators when designing new assignments and assessment plans for dental students. Conclusion: LLMs are rapidly developing as artificial intelligence advances. Repeated studies are needed to assess the impact of LLMs on teaching, learning, and assessment experiences.

Keywords: artificial intelligence; AI; dental education, teaching; dental students; education; educational activities

CDHA Research Agenda category: capacity building of the profession

INTRODUCTION

The recent surge of artificial intelligence (AI) and large language models (LLMs) has perplexed educators across the world. Although the application of artificial intelligence is becoming a norm in modern life, it is not easy to define what AI is. Although the scientific discipline of AI has been around since the 1950s, the common understanding of AI has evolved since then.¹ In its current form, the term AI refers to the computational capability of interpreting large amounts of information to make decisions.¹ Many define AI as the study of building or programming computers or machines to do what the human minds can.^{2,3} Another broader definition of AI includes "the theory and development of computer systems able to perform tasks that normally require human intelligence, such as visual perception, speech recognition, decisionmaking, and translation between languages."4The use of AI and LLMs in education is being explored with great interest, although its impact on pedagogical advancement is unclear to many educators.⁵ Large language models (LLMs) are a recent advancement in AI. Trained with extensive data, LLMs can generate human-like text and conversation, answer questions, translate, and complete language-related tasks with high accuracy.⁶ LLMs, like ChatGPT, have potential as teaching tools that may create opportunities for personalized learning, lesson planning, report writing, language learning, and assessment.⁶ However, it can also become a 'Pandora's Box' if instructors and students are not cognizant of the limitations of this technology and ethical considerations are not thoroughly explored.⁷

A. What are LLMs? How do they work?

Large language models (LLMs), including Generative Pre-trained Transformers (GPTs), a subcategory of LLMs, came about from years of study on natural language processing, machine learning, and neural networks.^{8,9} Transformer, which is the building block of large-scale natural

language processing, is an essential component of LLMs. The Transformer, a simple network architecture based solely on attention mechanisms, was first introduced in 2017 by Vaswani et al.¹⁰ GPTs are trained on immense amounts of data, making them capable of understanding and generating natural language to perform various tasks.^{8,9} These models are trained to predict the next word in a sentence based on the context of the preceding words by attributing a probability score to the recurrence of words.¹¹ These models are also trained on a massive corpus of text, allowing them to teach topics including grammar, semantics, and conceptual relationships.⁷ The performance of the LLMs can also be improved through prompt engineering, prompt tuning, and reinforcement learning with human feedback¹² (Figure 1). Prompt engineering and prompt tuning are two closely related, but different techniques that can improve the output of an LLM. Prompt engineering refers to crafting prompts that guide the LLM in understanding the language and the intent of the query. Prompt tuning, on the other hand, leverages optimization techniques to find the best prompt for a given task¹³ Currently most popular LLMs include different versions of ChatGPT, Bing Chat, Copilot, Claude Gemini, and LLaMA.

B. Pros and cons of using LLMs in education

With the ability to rapidly produce human-like text, LLMs can play roles in developing teaching materials, summarizing documents, and identifying gaps to ensure comprehensive coverage of topics in a curriculum.¹² LLMs can also provide real-time explanations of lecture content, create questions, and facilitate small group discussions.¹⁴ LLMs also have the potential to help students by providing personalized learning materials, and practice questions.

The capabilities of LLMs come with many caveats. The ability to use LLMs to answer questions and write reports can be exploited, resulting in cheating and academic dishonesty¹⁵ and consequently, educators are not able to accurately evaluate student learning. LLMs are also not entirely dependable or sound. They can create text with incorrect references and provide citations that do not exist or are irrelevant,^{16,17} rendering this technology unreliable. Another limitation of current LLMs is the generation of different responses for the same prompt. This feature can make LLMs more 'human-like,' and consequently makes 'AI-generated' text challenging to identify. This feature can create different and maybe contradicting responses on the same topic, making this technology less trustworthy as a teaching aid.¹⁴

C. Objective of the review

The potential of LLMs in health education, for both admirable and nefarious purposes, is vast. It is essential for health professional educators to be well-versed in the current trends, evolution, and application of AI technology to manage the rapidly changing educational landscape. This narrative review explores the current literature to identify the application of LLMs in dental education. We aim to answer the following questions:

- 1. What is the focus of existing research regarding the application of LLMs in dental education?
- 2. What are the key findings of the research regarding the application of LLMs in dental education?

METHODS

An extensive literature search was conducted in PubMed, CINAHL Plus, and Education Research Complete, with the search string (((Large language model) OR (Chatbot)) OR (ChatGPT)) AND (Dental education) with no limit on year of publication. Primary research articles that are experimental and intervention studies, published in English and relevant to our research questions were included. The initial search from the three databases identified 95 records, which were first screened by the title and then by full-text review and excluded reports that were not English, unavailable in full-text, did not include faculty or students from dental education, focused on patient education, or did not apply LLMs or any AI technologies (Figure 2). Review studies, perspectives, and editorials were excluded (Table 1). After the article selection was finalized, data was extracted from the included studies, including authors, year and origin of publication, research method, study participants, the LLM used in the study, and the key findings related to the research question (Table 2, Table 3).

RESULTS

After two rounds of screening, 28 articles were included in the review; all of which were either experimental or intervention studies focused on applying or evaluating LLMs in dental education. All studies applied quantitative research methods and were published between 2023 and 2024. The LLMs used in the studies included ChatGPT versions 3, 3.5, 4.0, 40 and 4V (n =24), Bing Chat (n=3), Bard (n = 1), Gemini (n = 4), Copilot (n=1), Llama 2 (n=1), Claude3-Opus (n=1) and custom Chatbots developed by the authors (n = 2). Twelve studies^{18-20,23-25,27,28,30,31,36,44} compared between multiple LLMs or different version of the same LLM (Table 2, Table 3). Extraction and analysis of the data from the included studies emerged two major themes: (i) Assessing the performance of LLMs on standardized exams and (ii) Assessing LLMs as teaching tools.

A. LLM performance on standardized exams

Fifty-seven percent (57%, n=16) of the included studies^{18-32,44} focused on evaluating the performance of multiple LLMs on dental student assessments (Table 2). As reported in these studies, ChatGPT 4 and 4V achieved passing scores when presented with questions from multiple dental board exams across the world, including the dental licensing examination,¹⁸ periodontic inservice examinations administered by the American Academy of Periodontology (AAP),^{19,25} Swiss Federal Licensing Examination in Dental Medicine (SFLEDM),²⁰ Integrated National Board Dental Examination (INBDE) of Iran,²⁸ Korean Dental Licensing Examination (KDLE)³⁰ and Japanese national dental examination.³² When the exam performance was compared between versions of ChatGPT, ChatGPT 4 outperformed ChatGPT 3 and 3.5. Bing and Bard also achieved acceptable scores on the exam (Table 2).

B. LLMs as teaching tools

Forty-three percent (43%, n=12) of studies^{33-43,45} focused on evaluating the effectiveness of LLMs as a teaching tool to improve students' learning experiences (Table 3). The evaluation of LLMs as self-directed learning tools yielded mixed results. Bhatia et al.³³ reported that the students who studied using the conventional method performed better in exams compared to the student groups who studied using ChatGPT. However, the opposite findings were reported by Kavadella et al.³⁴ and Roganović.³⁵

Several studies explored the ability of LLMs to perform tasks typically done by an instructor in a course.^{36-39,45} After providing textbook or other content as input, LLMs were able to produce questions from the given text input.^{36,37} Apart from minimal errors, ChatGPT and Gemini produced good-quality questions from the provided content as evaluated by faculty and content experts. ^{36,37} Hultgren et al.³⁸ prompted ChatGPT with questions dental students asked during an online discussion forum. ChatGPT answered those questions equally well or in more depth than the actual instructor. Rahad et al.³⁹ prompted ChatGPT to check student assignments with intentionally embedded errors. ChatGPT was successful in identifying and correcting all the errors in student assignments.

A number of studies explored the interaction and perception of dental students and educators toward LLMs.⁴⁰⁻⁴³ Students found ChatGPT to be helpful in writing assignments,⁴² creating opportunities for practice,⁴¹ improving interactions with patients, enhancing receptiveness, and reducing anxiety.⁴⁰ The only study exploring educators' perceptions of LLMs reports that most educators recognize their potential in dental education but are concerned about the potential reduction of human interaction.⁴³

DISCUSSION

This review study explored the current literature to identify the ongoing research trends, applications, and impacts of LLMs in dental education. The technology of LLMs is still in its infancy, with most studies published within the last year. The articles were published from across the world, indicating a global interest in LLMs.

For educators, the most crucial concern with LLMs is their use by students to exploit academic integrity. Many studies thus have explored how well LLMs can answer questions that are usually used in high-stakes exams. The findings that LLMs can successfully pass and, in many cases, perform even better than real students, raise concerns about the current assessment methods. However, findings show that LLMs perform poorly in critical appraisal of literature and interpretation-type questions, shedding light on how to make assessments 'AI-proof.' . Figure 3 outlines the key findings from the literature.

One of the features of LLMs is that their responses are inconsistent with the prompts. Although this feature makes these LLMs more 'human-like,' it creates concerns about the application of LLMs in education and healthcare. Although LLMs were found to provide detailed and satisfactory answers to most students,³⁸ they failed to consider patient demographics or clinical context when providing recommendations to patients.⁴⁴ LLMs have also been reported to provide fake references supporting scientific facts in their text-based response.^{16,17} Educators must consider these underlying limitations of LLMs while considering them as teaching assistants (Figure 3B).

Improving LLMs and fine-tuning their responses by further training is possible and can be very helpful to meet specific needs. Two studies in this review have reported developing and evaluating custom-built chatbots.^{40,41} LLMs, trained to perform specific tasks, may improve their performance and reduce inconsistency, an area that is still open for further research. Educators must carefully consider LLMs as teaching tools.

Though some studies showed that LLMs respond to student queries with more sophisticated, detailed answers than instructors,³⁸ these responses do not necessarily consider the learner level and may result in confusion if the answers are more complex or nuanced than the

students can appreciate. Student characteristics like learner level, amount of clinical experience, and pre-requisite knowledge are not incorporated into LLM response and may result in the generation of an answer that is overly complex or too simplified.

Dental hygiene education, a part of dental education is also affected by the application of LLMs. Dental hygiene curriculum across the world consists of foundational and clinical learnings. Rahad et al.³⁹ reported the ability of ChatGPT to aid dental and dental hygiene students with their writing by effectively recognizing and accurately rectifying dental-specific terminologies. ChatGPT-generated practice questions also helped dental and dental hygiene students prepare for exams.³⁹ However, some studies indicate possible weekness of ChatGPT-4.0 in its knowledge on dental hygiene practices and theories. In an very recent exploration of how four different LLMs performed on the Japanese National Dental Hygienist Examination, Yamaguchi et al.⁴⁶ showed that LLMs achieved an average score of 68.15%, with ChatGPT-4.0 performing the best at 75.3%, though it was not statistically significant. Notably, though, ChatGPT-4.0 performed the worst of all four LLMs at questions that addressed the theory of preventive dental procedures and introduction of dental hygiene, both of which are critical aspects of the dental hygiene profession. This suggests that though ChatGPT-4 may have increased dental knowledge,⁶ the training data lacks specific material related specifically to the dental hygiene knowledge set and may consequently disadvantage students who elect to use the most current GPT as part of their learning. This demonstrates the essential need to ensure that dental hygiene trainees and practitioners are equipped with critical analysis skills to carefully evaluate the information they may receive outside of the classroom and as part of their continuing education.

Besides text, the recent version of ChatGPT can now recognize image and audio inputs and can talk back.⁴⁷ Dental hygiene students extensively study macro and micro-anatomy of tooth and

facial structures. With image recognition ability LLMs can potentially help students to identify and study anatomical structures. With the ability to receive and return audio, the newest versions of ChatGPT can become a valuable tool for dental and dental hygiene students to practice patient interactions and prepare for the OSCE (Observed Structured Clinical Examination). In dental hygiene education, LLMs can also be leveraged to be used in the back-end administrative and management tasks. For example, LLMs are particularly adept at big data learning analytics. The information can track performance, improve pedagogical tools, and/or identify at-risk students. LLMs with the latest upgrades can create case-based scenarios for students and reduce standardized patient costs. We believe the key findings extracted from this literature review will be a helpful guide for many dental and dental hygiene educators (Figure 3).

CONCLUSION

Like many new technologies, LLMs are still evolving. The underlying limitations have obscured the potential of this technology. Educators must be vigilant when applying this technology to reduce their workload and improve student learning experiences. Further studies are needed in this area to enhance and fine-tune the performance of LLMs and explore their impact on students' learning experiences.

Practice Implications:

• The recent emergence of Large Language Models (LLMs) has necessitated educators to be aware and cautious about applying these technologies in dental and dental hygiene education. • Task-specific training and prompt engineering can tailor the LLMs to meet the specific needs of dental and dental hygiene education.

DISCLOSURES

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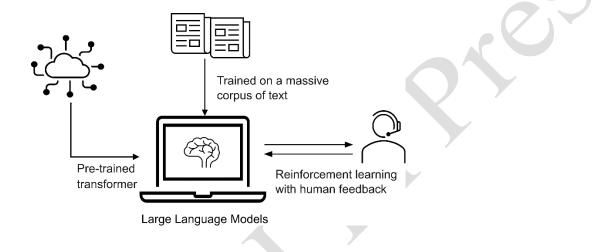
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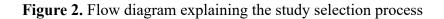
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FIGURES AND TABLES

Figure 1. Development of Large Language Models (LLMs). LLMs are developed on the generative pre-trained transformer, trained to predict the next word in a sentence based on the context of the preceding words by attributing a probability score to the recurrence of words. These models are also trained on a massive corpus of text. Several techniques, including reinforcement learning with human feedback, can also improve the performance of the LLMs.





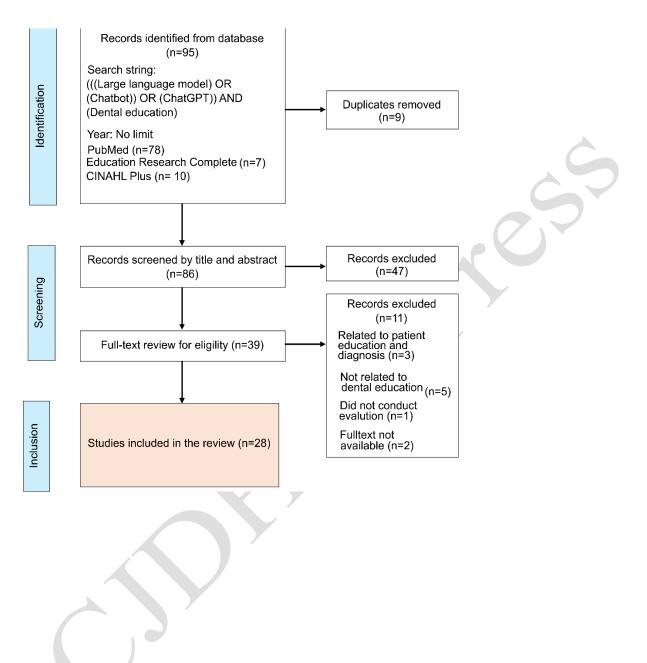
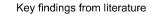


Figure 3. Key findings from the literature. Extraction and analysis of the data from the included studies emerged two major themes: (A) Assessing the performance of LLMs on standardized exams and (B) Assessing LLMs as teaching tools. The key findings from each theme are summarized here.

A





LLMs on standardized exams

Can provide accurate responses to the majority of knowledge-based assessments.

Do not perform well in the critical appraisal of the literature.

Fail to process questions based on images or perform poorly in image interpretation.

Perform better in short answer questions than multiple choice questions.

LLM achieved a higher accuracy rate for basic knowledge when compared with real students.



в

Key findings from literature

Can create good questions for educators.



Can answer questions from dental students in a similar or more elaborate way than a teacher.

Can successfully identify and correct errors in student assignments.

Students show positive attitude and satisfaction with LLMs.

Table 1. Inclusion and exclusion criteria

	Inclusion	Exclusion
Language	English	Non-English
Study focus	Dental Education	Non-dental education
Article type	Primary research studies	Conference proceedings, Reviews (including systematic reviews), Opinion, Editorial
	Peer reviewed	Non-peer reviewed
Study design	Any	Nil
Setting	Any	Nil

Table 2. Performance of Large Language Models (LLMs) in dental examinations and

assignments

	assignments					
	Author, Year, Country	LLM used2	Exam / Question type /Assignments	Aim of the study	Research Method	Key Findings
1	Chau et al., 2024 ¹⁸ China	ChatGPT 3.5 ChatGPT 4.0.	Dental licensing examination	Assess the performance of ChatGPT in Dental licensing examination.	146 MCQ from question books of the US and the UK dental licensing examinations were input into ChatGPT 3.5 and 4.0.	The passing grade of the US and UK denta lexaminations were 75% and 50%, respectively. ChatGPT 3.5 correctly answered 68.3% and 43.3% of questions from the US and UK dental licensing examinations, respectively. The scores for ChatGPT 4.0 were 80.7% and 62.7% respectively. ChatGPT 4.0 passed both written dental licensing examinations,however, ChatGPT 3.5 failed.
2	Brozovic et al., 2024 ²¹ Croatia	Bing Chat artificial intelligence	 (a) Exam questions for dental students, (ii) Guidelines for dental practitioners, (iii) Frequently asked questions by patients 	Assess the performance of Bing Chat artificial intelligence in: (a) Exam questions for dental students, (ii) providing guidelines for	Bing Chat was presented with (i) 532 multiple-choice questions. (ii) 15 questions, each with 2 follow-up questions on clinical protocols.	Bing Chat achieved 71.99 % in dental exam. For outlining clinical protocols for practitioners, Bing Chat achieved 81.05 %. For patients' frequently asked questions, Bing Chat scored 83.8 %.

	Author, Year,	LLM used2	Exam / Question type	Aim of the study	Research Method	Key Findings
	Country		/Assignments	dental practitioners, and (iii) answering patients' frequently asked questions.	(iii) 15 patients' frequently asked questions.The answers were assessed by 4 reviewers	
3	Ali et al., 2024 ²² Qatar	ChatGPT	Multiple recognised assessments in healthcare education curricula.	Investe the accuracy of ChatGPT in multiple recognised assessments in healthcare education curricula.	A total of 50 questions with 50 different learning outcomes were developed by the research team. Question formats including multiple-choice; short- answers; short essay; true/false; and fill in the blanks. Questions were presented to ChatGPT.	ChatGPT provided accurate responses to majority of knowledge-based assessments. ChatGPTcould not process questions based on images. Responses generated by ChatGPT to written assignments were satisfactory. ChatGPT received borderline scroes for critical appraisal of literature.
4	Cung et al.,2024 ⁴ USA	ChatGPT 4.0 BingAI Bard	(i) Basic and translational skeletal biology (ii) Clinical practitioner management of skeletal disorders (iii) Patient queries	To assess the performance of ChatGPT 4.0, BingAI, and Bard, to address 30 questions in 3 categories: basic and translational skeletal biology, clinical practitioner management of skeletal disorders, and patient queries.	Thirty questions from each categories were posed to the chat bots, and responses were independently graded for their degree of accuracy by four reviewers.	ChatGPT 4.0 had the highest overall median score in each categories. Each chatbots displayed distinct limitations that included inconsistent, incomplete, or irrelevant responses, inappropriate utilization of lay sources in a professional context, a failure to take patient demographics or clinical context into account when providing recommendations, and an inability to consistently identify areas of uncertainty in the relevant literature.
5	Danesh, et al.,2024 ¹ ⁹ USA	ChatGPT 3.5 ChatGPT 4.0.	Periodontic in- service examination administered by the American Academy of Periodontology (AAP).	To explore ChatGPT's foundation of knowledge in the field of periodontology.	ChatGPT3.5 and ChatGPT4 were evaluated on 311 multiple-choice questions obtained from the 2023 in-service examination administered by the AAP.	ChatGPT3.5 and ChatGPT4 answered 57.9% and 73.6% of in- service questions correctly on the 2023 Periodontics In-Service Written Examination, respectively.
6	Danesh, et al.,2023 ² ³	ChatGPT 3.5 ChatGPT 4.0.	Board-style dental knowledge assessment	To evaluate the performance of ChatGPT on a board-style multiple-choice	ChatGPT3.5 and ChatGPT4 were asked questions from: INBDE Bootcamp, ITDOnline, and a list of board-style	ChatGPT3.5 and ChatGPT4 answered 61.3% and 76.9% of the questions correctly on average, respectively.

	Author,	LLM	Exam / Question	Aim of the	Research Method	Key Findings
	Year,	used2	type	study		
	Country		/Assignments	-		
	USA			dental	questions. Image-based	
				knowledge	questions were excluded.	
7	Fuchs et	ChatGPT 3	Swiss Federal	assessment To evaluate the	The SFLEDM multiple-	The average accuracy rates in the
,	al., 2024 ²⁰ Switzerla	ChatGPT 4	Licensing Examination in Dental Medicine (SFLEDM)	performance of ChatGPT 3 and ChatGPT 4 on self-assessment	choice questions from the University of Bern's Institute for Medical Education platform were	SFLEDM was 63.3%, with ChatGPT 4 outperforming ChatGPT 3.
	nd			questions for dentistry, through the Swiss Federal	administered to both ChatGPT versions, with and without priming.	ChatGPT 3's performance exhibited a significant improvement with priming.
				Licensing Examination in Dental Medicine (SFLEDM).		2
				To assess the impact of priming on		
				ChatGPT's performance.		
8	Jeong et	ChatGPT,	Oral and	To evaluate the	Chatbots were tested on	The students' overall accuracy rate
	al.,	ChatGPT	maxillofacial	performance of	52 questions from	was 81.2%, while that of the
	2024 ²⁴	Plus,	radiology	four large	regular dental college	chatbots varied: 50.0% for
	Korea	Bard, Bing Chat	examination	language model (LLM)-based chatbots by	examinations. Questions were categorized into: basic knowledge,	ChatGPT, 65.4% for ChatGPT Plus, 50.0% for Bard, and 63.5% for Bing Chat.
				comparing their test results with those of dental students.	imaging and equipment, and image interpretation. The accuracy rates of the chatbots were compared with the performance of students.	ChatGPT Plus achieved a higher accuracy rate for basic knowledge than the students (93.8% vs. 78.7%).
						All chatbots performed poorly in image interpretation, with accuracy rates below 35.0%.
			2			All chatbots scored less than 60.0% on MCQs, but performed better on SAQs.
9.	Sabri et al., 2024 ²⁵ USA	GPT-4 GPT-3.5 Gemini	Annual in-service examination by the American Academy of Periodontology (APP).	To evaluate the performance of LLMs in professional exams and compare with the human	1312 questions from the annual AAP examination were presented to the LLMs. Their responses were analyzed using chi- square tests and compared with the	ChatGPT-4 outperformed all human control groups, GPT-3.5 and Gemini in all exam years (p < .001).
				control group.	scores of periodontal residents as the human control group.	

	Author,	LLM	Exam / Question	Aim of the	Research Method	Key Findings
	Year, Country	used2	type /Assignments	study		
10.	Brondani et al., 2024 ²⁶ Canada	ChatGPT	Reflection assignments	To evaluate if university instructors can differentiate reflection assignments created by ChatGPT and students.	Hardcopies of 20 reflections (10 generated by undergraduate dental students and 10 generated by ChatGPT) were distributed to three instructors with least 5 years of teaching experience. Instructors were asked to assign either 'ChatGPT' or 'student' to each reflection.	ChatGPT can write reflection assignments equally to dental students. However, instructors can differentiate between reflections generated by ChatGPT or by students most of the time.
11.	Quah et al., 2024 ²⁷ Singapor e	GPT-3.5 GPT-4 Llama 2 Gemini Copilot	Oral and maxillofacial surgery examinations	To evaluate the accuracy of LLMs in answering MCQ from the oral and maxillofacial surgery examination.	A total of 259 questions from the university's question bank were answered by the 5 LLMs	GPT-4 performed the best (76.8%), followed by Copilot (72.6%), GPT-3.5 (62.2%), Gemini (58.7%, 95%), and Llama 2 (42.5%).
12.	Dashti et al., 2024 ²⁸ Iran	GPT-3.5 GPT-4	Integrated National Board Dental Examination (INBDE), Dental Admission Test (DAT), Advanced Dental Admission Test (ADAT)	To investigated the effectiveness of ChatGPT in answering dentistry exam questions.	ChatGPT 3.5 and 4 were tested with 253 questions from the INBDE, ADAT, and DAT exams.	For the INBDE, both versions achieved 80% accuracy in knowledge-based questions and 66-69% in case history questions. ChatGPT 4 excelled on the DAT, with 94% accuracy in knowledge- based questions, 57% in mathematical analysis items, and 100% in comprehension questions.
13.	Jaworsk et al., 2024 ²⁹ Poland	GPT-4o	Polish Final Dentistry Examination (LDEK)	To evaluate the performance of GPT-40 in the LDEK exam and compare it with human.	200 multiple choice type questions from Spring 2023 LDEK exam were used to test GPT-40.	GPT-40 correctly answered 70.85% questions. The GPT performed better in Endodontics (71.74%) and Prosthetic Dentistry (80%) but showed lower accuracy in Pediatric Dentistry (62.07%) and Orthodontics (52.63%). A statistically significant difference was observed between ChatGPT's performance on clinical case-based questions (36.36% accuracy) and other factual questions (72.87% accuracy), with a p-value of 0.025.
14.	Kim et al., 2024 ³⁰ USA	GPT3.5, GPT4 Claude3- Opus	Korean Dental LicensingExamin ation (KDLE)	To evaluate the performance of GPT in KDLE	KDLE questionnaire from 2019 to 2023 was used as inputs to the LLMs.	Claude3-Opus performed best among the LLMs used in the study. Claude3-Opus and ChatGPT-4 surpassed the cut-off scores in all the years considered; indicating that Claude3-Opus and ChatGPT-4

	Author, Year, Country	LLM used2	Exam / Question type /Assignments	Aim of the study	Research Method	Key Findings
						passed the KDLE, whereas ChatGPT-3.5 did not.
15.	Künzle et al., 2024 ³¹ Germany	GPT 3.5 GPT 4.0 GPT 4.0o Gemini 1.0	Restorative Dentistry and Endodontics (RDE) student assessment	To evaluate the performance of LLMs on solving restorative dentistry and endodontics (RDE) student assessment questions.	151 questions from a RDE question pool were prepared for prompting, entered into LLMs and answers recorded for analysis.	The total answer accuracy of ChatGPT-4.0o was the highest, followed by ChatGPT-4.0, Gemini 1.0 and Chat- GPT-3.5 (72%, 62%, 44% and 25%, respectively) with significant differences between all LLMAs except GPT-4.0 models.
16.	Morishit a et al., 2024 ³² Japan	ChatGPT- 4V	Japanese national dental examination	To assess the capabilities of ChatGPT-4V with image recognition in answering imagebased questions from the Japanese National Dental Examination (JNDE)	The input dataset for the ChatGPT 4V used questions from the JNDE, with a focus on image-related queries.	The overall correct response rate of ChatGPT-4V for image-based JNDE questions was 35.0 %. The correct response rates were 57.1 % for compulsory questions, 43.6 % for general questions, and 28.6 % for clinical practical questions.

Table 3. Performance of Large Language Models (LLMs) as teaching tools

	Author,	LLM used	Aim of the	Research Method	Study	Key Findings
	· · · ·	LLIVI uscu		Research Wiethou	-	Key Findings
	Year,		study		Participant	
	Country				S	
1	Bhatia et	ChatGPT	To determine	Students were randomly	100 dental	The mean test scores for students
	al., 2024 ³³		whether the	divided into two groups.	students	from the conventional method
			ChatGPT is more	Group A was given textbooks		group are higher than the mean
	USA		effective than	to read and Group B used the		scores for the ChatGPT group for
			conventional	ChatGPT. The pre- and post-		the post-test.
			teaching	test scores were compared.		-
		1	methods in			Traditional teaching methods are
			teaching			more effective for learning than
			undergraduate			understanding ChatGPT.
			dental students.			
2	Ahmed et	ChatGPT	To investigate	Sixteen paragraphs from a	NA	No significant differences were
	al., 2023 ³⁶		the effectiveness	textbook were extracted and		found between the questions
		Google	of ChatGPT and	used as input in		generated by ChatGPT and
	Saudi	Bard	Google Bard in	ChatGPT and Bard language		Bard.
	Arabia	(Gemini)	generating	models to produce multiple-		
			multiple-choice	choice questions based on the		Bard-generated questions tended
			questions for	input. Three dental specialists		to have higher cognitive levels
			educators of	assessed the relevance,		than those of ChatGPT.
			dental caries.	accuracy,		

	Author, Year, Country	LLM used	Aim of the study	Research Method	Study Participant s	Key Findings
	Country			and complexity of the generated questions.	3	Format error was predominant in ChatGPT-generated questions. Bard exhibited more absolute
3	Fang et al., 2024 ⁴⁰ USA	Custom- developed chatbot (CB)	To investigate the awareness and perceptions of artificial intelligence (AI), interaction experiences, and concerns about a custom- developed chatbot (CB) compared with the traditional Blackboard (BB) online platform.	Students were randomly divided into custom- developed chatbot (CB) group and the traditional Blackboard (BB) group. BB (n=43) and CB (n=43) groups and asked to engage with their designated platforms for 10 to 15 minutes by focusing on clinical inquiries in a predoctoral implant clinic. After the interaction, participants responded on a 5-point Likert scale to a 19- item survey.	86 dental students	terms than ChatGPT. The CB group demonstrated improved timeliness (P <.001), more interaction (P <.001), enhanced receptiveness (P =.002), and less anxiety (P <.001) and was more satisfied (P <.001) when compared with the BB group.
4	Hultgren et al., 2023 ³⁸ Sweden	ChatGPT 3.5	Compared the ability of GPT- 3.5 and teachers to answer questions from dental students.	The questions from the students and replies from the teachers were obtained from an online discussion forum during a course in microbial pathogenesis for dental students. The same questions were administered to GPT- 3.5.	The questions were asked by 22 dental students who took the course on microbial pathogenesis	GPT-3.5 answered the questions from dental students in a similar or even more elaborate way compared to the answers that had previously been provided by a teacher.
5	Kavadella et al., 2024 ³⁴ Cyprus	ChatGPT	To evaluate the implementation of ChatGPT in the educational process.	Studetns were devided into two groups and were asked to perform an assignment. One group searched the internet for scientific resources and the other group used ChatGPT for this purpose. Both groups developed a PowerPoint presentation based on their research and presented it in class. Seventy students undertook a knowledge examination	77 dental students	In the knowledge test, students of the ChatGPT group performed significantly better than students of the literature research group.
6	Or et al, 2024 ⁴¹ Australia	Custom- developed history- taking chatbot	To assess student perception and acceptance of a history-taking chatbot.	A history-taking chatbot was developed for students to act as 'clinician' and the chatbot as 'patient.' A survey was conducted.	13 Doctor of Dental Medicine student	Most students agreed that they participated more with the chatbot. Most students also agreed that the chatbot would provide more opportunities for them to practice.
7	Ozbay, 2024 ³⁷	ChatGPT 4	To evaluate the ability of ChatGPT-4 to	International Association of Dental Traumatology guidelines for the	NA	52% of the questions were usable without modification or with minor changes.

	Author, Year,	LLM used	Aim of the study	Research Method	Study Participant	Key Findings
	Country Turkey		generate clinical case-based multiple-choice questions.	management of traumatic dental injuries were introduced to ChatGPT- 4 as an information source and prompted to generate 20 questions in fractures and luxations, avulsion of permanent teeth, injuries in the primary dentition. Questions were evaluated by 2 endodontists.	S	28% questions were incorrect.
8	Rahad et al., 2023 ³⁹ USA	ChatGPT 3.5	To assess ChatGPT's utilities for enhancing pedagogical aspect of dental education.	Student essays were collected and errors were embedded regarding dental terminologies. The essays were presented to ChatGPT to check if it can identify and correct the dental-specific terms.	NA	ChatGPT successfully identified and corrected all the errors in student assignments.
9	Roganovi ć. 2024 ³⁵ Serbia	ChatGPT	To investigate how reading of an AI system (ChatGPT) features/descripti ons influences the willingness and expectations of using this technology.	Students were asked to learn about side effects of drugs used in dental practice via reading recommended literature or ChatGPT. Expectations towards ChatGPT were measured by survey, before and after reading of a system features description. Learning outcomes were evaluated via pharmacology quiz.	104 dental students	Students who used ChatGPT (YG group) showed better results on the pharmacology quiz than students who neither read the description nor used ChatGPT for learning (NN condition). Students who read the description of ChatGPT features yet did not use it (NG) showed better results on the pharmacology quiz compared with the NN condition. The NG students compared to the YG students had less trust in AI system assistance in learning, and after the AI system description reading, their expectations changed significantly.
10	Saravia- Rojas et al., 2024 ⁴² Peru	ChatGPT	To assess the influence of ChatGPT on the academic tasks performed by dental students.	Participants were asked to complete scientific writing assignments using ChatGPT and conventional search methods. The assignments were reviewed by professors. Anonymous questionnaire was administered to the students regarding the usefulness of ChatGPT.	55 dental students	64.29% of the students found ChatGPT useful, 33.33% found it very useful. Regarding its application in further academic activities, 54.76% considered it useful, 40.48% found it very useful. All students provided positive feedback.
11	Uribe et al., 2024 ⁴³ Latvia	Any Artificial Intelligence (AI) chatbots	To explore dental educators' perceptions of AI chatbots and	A global cross-sectional survey was conducted to evaluate dental educators' perceptions of AI chatbots	428 dental educators	31% of the participants already use AI tools.64% recognize their potential in dental education.

	Author, Year, Country	LLM used	Aim of the study	Research Method	Study Participant s	Key Findings
			large language models	and their influence on dental education.		Educators stated that AI chatbots could enhance knowledge acquisition (74.3%), research (68.5%), and clinical decision- making (63.6%) but expressed concern about the potential reduction of human interaction (53.9%).
12	Quah et al., 2024 ⁴⁵ Singapore	GPT 4	To explore how reliable is ChatGPT in automated essay scoring (AES) for oral and maxillofacial surgery (OMS) examinations compared to human assessors	Sixty-nine undergraduate dental students participated in a closed-book examination comprising two essays. Using pre-created assessment rubrics, three assessors independently performed manual essay scoring, while one separate assessor performed AES using ChatGPT -4. Intraclass correlation coefficient and Cronbach's α were calculated to evaluate the reliability and inter-rater agreement of the test scores among all assessors.	69 denal students	A strong correlation between all manual scorers was observed for one question ($r = 0.752-0.848$, p < 0.001) whereas a moderate correlation was observed for the other question ($r = 0.527-0.571$, p < 0.001).The results indicated a potential of ChatGPT for essay marking.