

REVIEW



Education 4.0 and 5.0: integrating Artificial Intelligence (AI) for personalized and adaptive learning

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ABSTRACT

This research paper explores how the integration of Artificial Intelligence (AI) in the education sector is bringing about transformative changes, particularly within the frameworks of Education 4.0 and 5.0. In response to the evolving technological landscape, education is undergoing a shift to address the challenges of the 21st century, moving away from traditional models to embrace more personalized and adaptive approaches. Education 4.0 represents a significant shift where technology, notably AI, is harnessed to enhance the learning experience. The paper investigates the utilization of AI technologies, such as machine learning algorithms and natural language processing, to create personalized learning environments. These environments are designed to meet the specific needs and preferences of individual learners, fostering a more engaging and effective educational experience. The move from Education 3.0 to 4.0 signifies a departure from standardized, one-size-fits-all approaches to education, embracing a more dynamic and responsive system. Expanding on the principles of Education 4.0, Education 5.0 takes the integration of AI in education a step further by emphasizing adaptive learning. The paper delves into the concept of adaptive learning, exploring how AI systems can dynamically adjust instructional strategies based on real-time feedback and learner progress. Education 5.0 seeks to optimize the learning journey by tailoring content, pace, and assessments to each student's abilities and learning style, aiming to improve overall educational outcomes. Additionally, the research examines the challenges and ethical considerations associated with the widespread adoption of AI in education. It critically evaluates issues related to data privacy, bias in AI algorithms, and the potential impact on teacher-student relationships. The findings emphasize the need to strike a balance between technological innovation and ethical considerations, ensuring the responsible and effective integration of AI in personalized and adaptive learning environments.

KEYWORDS

Artificial Intelligence;
Education 4.0; Education
5.0; Learning; Industry 4.0;
Medical education;
Engineering education

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Introduction

In educational the imperative integration of cutting-edge technologies has emerged to meet the evolving needs of 21st-century learners. Standing on the brink of the fourth industrial revolution, which amalgamates digital, biological, and physical realms, the educational paradigm is undergoing profound transformation [1-4]. Education 4.0 and the nascent Education 5.0 signify the vanguard of this transformative journey, promising a pedagogical revolution where Artificial Intelligence (AI) assumes a central role, ushering in personalized and adaptive learning experiences [5-7]. The evolution of education can be succinctly traced through its various phases. Education 1.0 embraced a traditional one-size-fits-all approach, marked by rote memorization and teacher-centered instruction. Education 2.0 saw the advent of multimedia and the infusion of technology into classrooms, shifting towards interactive and engaging learning experiences. Education 3.0 emphasized student-centric learning, collaborative environments, and the integration of web-based tools, laying the foundation for the current era of digital education [8-11].

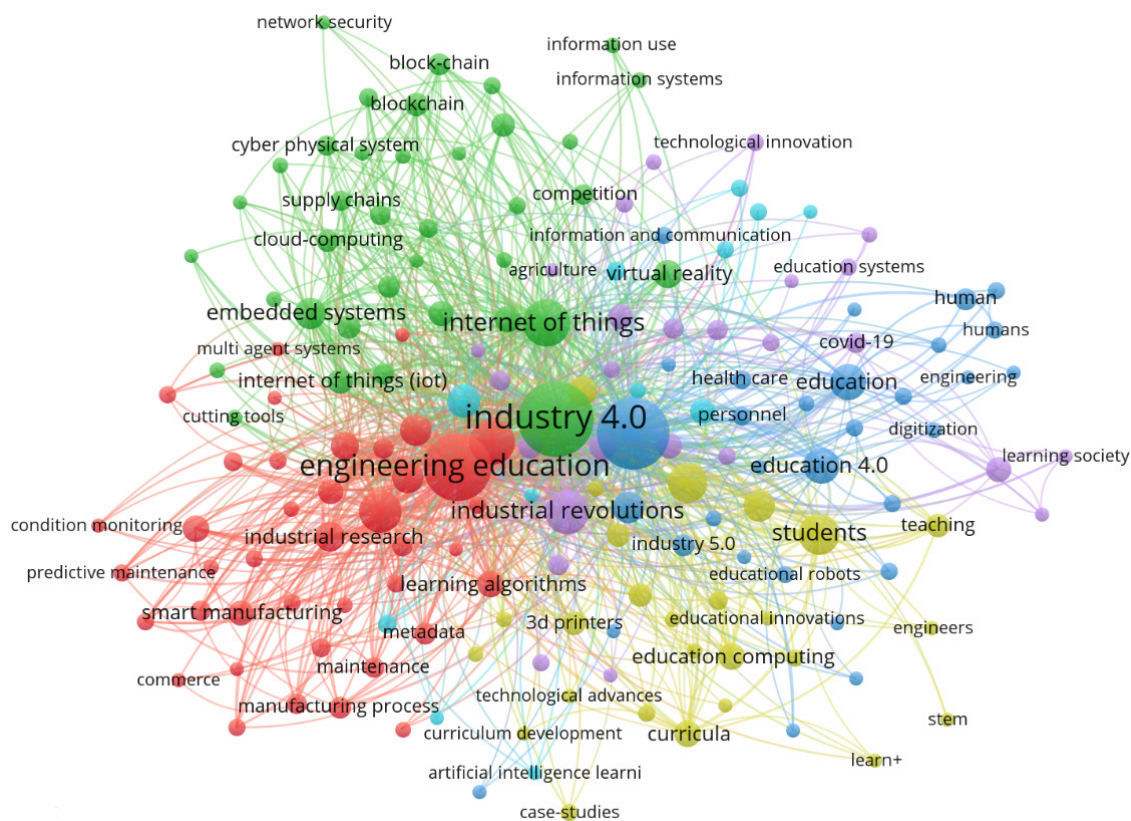
Entering Education 4.0, the landscape is characterized by the convergence of technologies such as AI, the Internet of Things

(IoT), big data analytics, and cloud computing [12-16]. AI, in particular, emerges as a catalyst for educational transformation, offering the potential to customize learning experiences according to individual learners' unique needs and preferences [17-22]. The integration of AI not only facilitates personalized learning paths but also enables adaptive systems that dynamically respond to the learner's progress, fostering a more efficient and effective educational process [23-26]. The transition from Education 4.0 to the emerging Education 5.0 signifies a deepening commitment to individualized learning experiences [8-10]. Education 5.0 envisions a future where the symbiotic relationship between human intelligence and AI optimizes the augmentation of learners' cognitive abilities, transcending traditional educational boundaries [15,16]. This phase heralds an era where AI becomes integral to the learning ecosystem, seamlessly woven into educational practices to enhance creativity, critical thinking, and problem-solving skills (Figure 1).

The rise of AI in education is propelled by its capacity to process vast amounts of data and generate insights that inform personalized learning pathways. Machine learning algorithms, a subset of AI, analyze individual learning

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conventional education, offering a bespoke educational journey for every learner. A defining feature of AI in Education 4.0 and 5.0 is its ability to create adaptive learning environments [7,10,13].



These systems leverage real-time data to adjust the pace, content, and delivery of instruction based on the learner's performance and mastery of concepts. This adaptability ensures that learners progress at their own pace, receiving additional support or challenges as needed, fostering a more inclusive and effective educational experience. Moreover, AI facilitates the cultivation of essential 21st-century skills by promoting interactive and experiential learning. Through the integration of virtual reality (VR) and augmented reality (AR) technologies powered by AI, students can engage in immersive and realistic simulations, transcending the constraints of traditional classrooms [34-40]. This not only enhances subject comprehension but also nurtures creativity, collaboration, and problem-solving abilities skills crucial for success in the contemporary global landscape.

fostering fairness and inclusivity in education. The research highlighted the potential of AI-driven adaptive learning platforms to address disparities in educational achievement among marginalized student groups. By employing machine learning algorithms to detect and bridge individual learning gaps, these platforms empower educators to provide tailored assistance to students from diverse backgrounds, thereby cultivating a more equitable learning atmosphere [10-13].

Nevertheless, despite the considerable potential of AI in education, it is not devoid of challenges and constraints. Recent literature has raised concerns regarding the ethical ramifications of AI algorithms in educational contexts. For instance, research pointed out the possibility of algorithmic bias in AI-based assessment tools, which could inadvertently perpetuate existing inequalities in education. Additionally, issues related to data privacy and security have emerged as significant considerations in the adoption of AI technologies in educational institutions [21,24,30-33]. In response to these challenges, scholars and policymakers advocate for a nuanced approach to the integration of AI in education, one that prioritizes ethical considerations and safeguards against potential negative consequences. Emerging trends in AI research, such as federated learning and differential privacy, present promising avenues for addressing privacy concerns

while upholding the advantages of personalized learning. By decentralizing the training of AI models and integrating privacy-preserving techniques, educators can harness AI's potential to improve learning outcomes while safeguarding sensitive student information.

Ethical considerations, data privacy concerns, and the potential for biases in AI algorithms pose substantial hurdles that must be addressed to ensure the responsible and equitable implementation of AI in educational settings [41-44]. Striking a balance between technological innovation and ethical considerations is paramount to the success and sustainability of AI-driven education [45-50]. This research paper aims to delve into the intricate tapestry of Education 4.0 and 5.0, exploring the transformative potential of AI in personalized and adaptive learning environments. By examining the current landscape, challenges, and future prospects of AI integration in education, this study contributes to the discourse surrounding the optimal utilization of AI to enhance the educational experience (Figure 2).

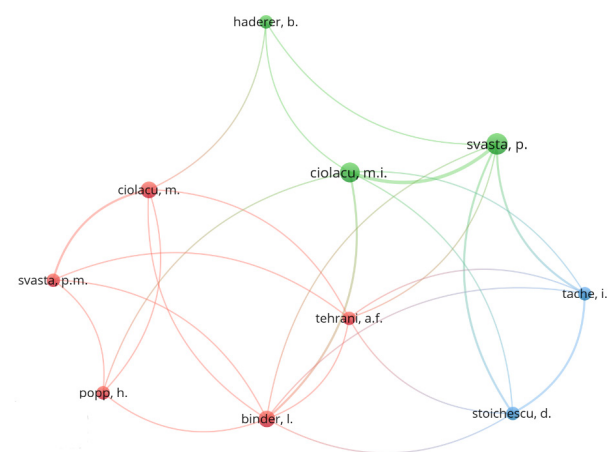


Figure 2. Co-authorship analysis (VoSViewer).

Methodology

In this research, we employed a comprehensive methodology consisting of a literature review, bibliometric analysis, and keyword analysis to explore the incorporation of Artificial Intelligence (AI) within the frameworks of "Education 4.0" and "5.0." This approach was designed to thoroughly examine the current state, trends, and impacts of AI in education, with a specific focus on "personalized learning" and "adaptive learning."

Literature review

We conducted an extensive review of scholarly articles, research papers, conference proceedings, and other academic sources to gain insights into the theoretical foundations, practical applications, and emerging trends of AI in education. Searches were performed across various electronic databases, including "PubMed," "IEEE Xplore," "Scopus," and "Google Scholar," using relevant keywords related to AI and education within the contexts of "Education 4.0" and "5.0."

Bibliometric analysis

In addition to the literature review, we conducted a bibliometric analysis to quantitatively assess the academic landscape. By retrieving metadata and citation data from platforms such as "Web of Science" and "Scopus," we utilized network analysis

techniques to visualize relationships among authors, and keywords in the literature. This analysis provided insights into collaborative networks, publication trends, and the research impact within the AI in education field.

Keyword analysis

Furthermore, a keyword analysis was performed to identify key terms and concepts influencing the discourse on AI in education, particularly focusing on "personalized learning" and "adaptive learning." Through this analysis, we identified prevalent themes, emerging trends, and areas of research interest at the intersection of AI and education. This helped contextualize our findings within the broader conversation and pinpoint potential areas for further exploration.

Integration and synthesis

By synthesizing insights from the literature review, bibliometric analysis, and keyword analysis, we gained a comprehensive understanding of the current landscape of AI integration in education. This triangulation of data sources allowed us to identify research gaps, emerging trends, and future directions in the field. Our methodological approach facilitated valuable insights into the implications of AI for personalized and adaptive learning, as well as the ongoing discourse in this area.

Discussion

Artificial Intelligence in education 4.0

Education 4.0 encapsulates the fusion of emerging technologies, with a specific focus on AI, within the educational realm. It builds upon prior industrial revolutions in education: Education 1.0 (traditional classroom teaching), Education 2.0 (introduction of computers and the internet), and Education 3.0 (web-based collaborative learning). Education 4.0 strives to establish a dynamic and adaptive learning environment by harnessing the capabilities of AI, big data, the Internet of Things (IoT), and other cutting-edge technologies [51-56]. AI in Education 4.0 plays a multifaceted role, influencing various facets of the educational landscape [18-22]. The following are key areas where AI is significantly impacting the field:

Personalized learning

AI in Education 4.0 excels in tailoring learning experiences to individual students. Through the analysis of extensive data, AI systems grasp each student's unique learning styles, preferences, and strengths. This facilitates the creation of personalized learning paths, ensuring that students receive content and activities aligned with their needs. Adaptive learning platforms, powered by AI, dynamically adjust the difficulty and pace of lessons based on individual progress, optimizing understanding and retention.

Intelligent tutoring systems

AI-driven intelligent tutoring systems provide real-time, personalized assistance to students. These systems offer guidance, feedback, and additional resources based on individual student performance. By continually assessing knowledge and adapting to learning paces, intelligent tutoring systems contribute to a more effective and engaging learning experience.

Automation of administrative tasks

AI streamlines administrative tasks, freeing up educators to focus on teaching and mentoring. Routine responsibilities like

grading, attendance tracking, and resource allocation can be automated through AI systems. This not only saves time but also reduces the risk of human error, enabling educators to concentrate on more strategic aspects of teaching.

Enhanced curriculum development

AI analyzes extensive educational data to identify trends, gaps, and areas for improvement in curricula. This data-driven approach empowers educators to develop more relevant and effective teaching materials. Additionally, AI algorithms assess the success of different teaching methodologies, recommending adjustments to enhance overall learning outcomes.

Gamification and interactive learning

Integrating AI into educational games and interactive learning platforms boosts engagement and motivation among students. AI algorithms adapt game scenarios and challenges based on individual progress, providing a customized and enjoyable learning experience. The combination of gamification and AI transforms traditional learning into a dynamic and interactive process.

Early intervention and learning analytics

AI tools can identify students at risk of falling behind or facing learning difficulties by analyzing performance data. Early intervention systems, using predictive analytics, identify potential challenges and provide targeted support to students who need it most. This proactive approach prevents academic struggles, ensuring students receive timely assistance.

Language processing for feedback

AI-powered natural language processing (NLP) systems analyze written assignments, offering instant feedback to students. This accelerates the grading process and provides constructive insights into students' writing skills, encouraging continuous improvement. NLP can also be utilized to develop language learning applications providing personalized language practice and feedback (Figure 3).

Future trends in AI in education 4.0

Looking ahead, several trends are likely to shape the future of AI in education, as shown in Table 1.

Table 1. The impact of emerging technologies and AI on different aspects of education.

Trend in Education	Description	References
Augmented Reality (AR) and Virtual Reality (VR)	AR and VR technologies have the potential to revolutionize the learning experience by creating immersive and interactive environments. AI can enhance these technologies by personalizing virtual experiences based on individual learning styles and preferences.	[35,39]
Blockchain in Education	Blockchain technology can securely and transparently record and verify academic credentials, facilitating a streamlined and reliable system for credentialing and certification.	[57-62]
Continued Growth of Online Learning	The integration of AI technology is likely to fuel the growth of online learning platforms. AI-driven tools can provide personalized support to online learners, making distance education more effective and accessible.	[18,63-67]
Collaboration Between Humans and AI	The future of AI in education involves closer collaboration between humans and intelligent machines. This partnership can lead to more effective teaching and learning experiences, with AI handling routine tasks and providing valuable insights.	[68-74]
Lifelong Learning and Upskilling	AI in Education 4.0 will play a crucial role in supporting lifelong learning and upskilling initiatives. As the job market evolves, individuals will need continuous learning opportunities, and AI can help tailor educational experiences to specific needs.	[69,75-80]

Following equations represent fundamental concepts and algorithms frequently used in artificial Intelligence;
PCA (Principal Component Analysis) Objective Function:

$$J = \frac{1}{m} \sum_{i=1}^m \|x^{(i)} - \tilde{x}^{(i)}\|^2 \quad (1)$$

Where,

J Objective function (mean squared reconstruction error)

m Number of data points

$x^{(i)}$ Original data point

$\tilde{x}^{(i)}$ Reconstructed data point

ReLU (Rectified Linear Unit) Activation Function:

$$f(x) = \max(0, x) \quad (2)$$

Where,

$f(x)$ Output of the ReLU activation function
 x Input to the activation function

Backpropagation Update Rule for Weights (Gradient Descent):

$$W_{ij} = W_{ij} - \alpha \frac{\partial E}{\partial W_{ij}} \quad (3)$$

Where,

W_{ij} Weight between neuron i and neuron j

α Learning rate

$\frac{\partial E}{\partial w_{ij}}$ Partial derivative of the error with respect to the weight.

Bayes' Theorem:

$$P(A|B) = \frac{P(B|A)P(A)}{P(B)} \quad (4)$$

Where,

$P(A|B)$ Probability of event A given event B

$P(B|A)$ Probability of event B given event A

$P(A)$ and $P(B)$ Marginal probabilities of events A and B

Reinforcement Learning - Q-Learning Update Rule:

$$Q(s, a) = (1 - \alpha)Q(s, a) + \alpha(R + \gamma \max_{a'} Q(s', a')) \quad (5)$$

Where,

$Q(s, a)$ Value of state-action pair (s, a)

α Learning rate

R Immediate reward

γ Discount factor

$\max_{a'} Q(s', a')$ Maximum value of the next state-action pair

Logistic Regression Equation:

$$P(Y=1) = \frac{1}{1+e^{-(mx+b)}} \quad (6)$$

Where,

$P(Y=1)$ Probability of the dependent variable being 1

e Euler's number (base of the natural logarithm)

m and b Parameters to be learned from the training data.

Support Vector Machine (SVM) Decision Function:

$$f(x) = \text{sign}(w \cdot x + b) \quad (7)$$

Where,

$f(x)$ Decision function output

w Weight vector

x Input vector

b Bias term

Neural Network Activation Function (e.g., Sigmoid):

$$\sigma(z) = \frac{1}{1+e^{-z}} \quad (8)$$

Where,

$\sigma(z)$ Sigmoid function output

z Weighted sum of inputs

K-Means Clustering Objective Function:

$$J = \sum_{i=1}^k \sum_{j=1}^n \|x_j - \mu_i\|^2 \quad (9)$$

Where,

J Objective function (sum of squared distances)

k Number of clusters

μ_i Centroid of cluster i

x_j Data point j

Gaussian Distribution Probability Density Function:

$$f(x|\mu, \sigma^2) = \frac{1}{\sqrt{2\pi\sigma^2}} e^{-\frac{(x-\mu)^2}{2\sigma^2}} \quad (10)$$

Where,

$f(x|\mu, \sigma^2)$ Probability density function of the Gaussian distribution

μ Mean of the distribution

σ^2 Variance of the distribution.

Softmax Function (Multiclass Classification):

$$\text{softmax}(z)_i = \frac{e^{z_i}}{\sum_{j=1}^K e^{z_j}} \quad (11)$$

Where,

$\text{softmax}(z)_i$ Probability of class i in a multiclass classification

e^z Exponential of the input for class i

$\sum_{j=1}^K e^{z_j}$ Sum of exponentials over all classes

Linear Regression Equation:

$$y = mx + b \quad (12)$$

Where,

y Dependent variable

X Independent variable

m Slope of the regression line

b Y-intercept of the regression line.

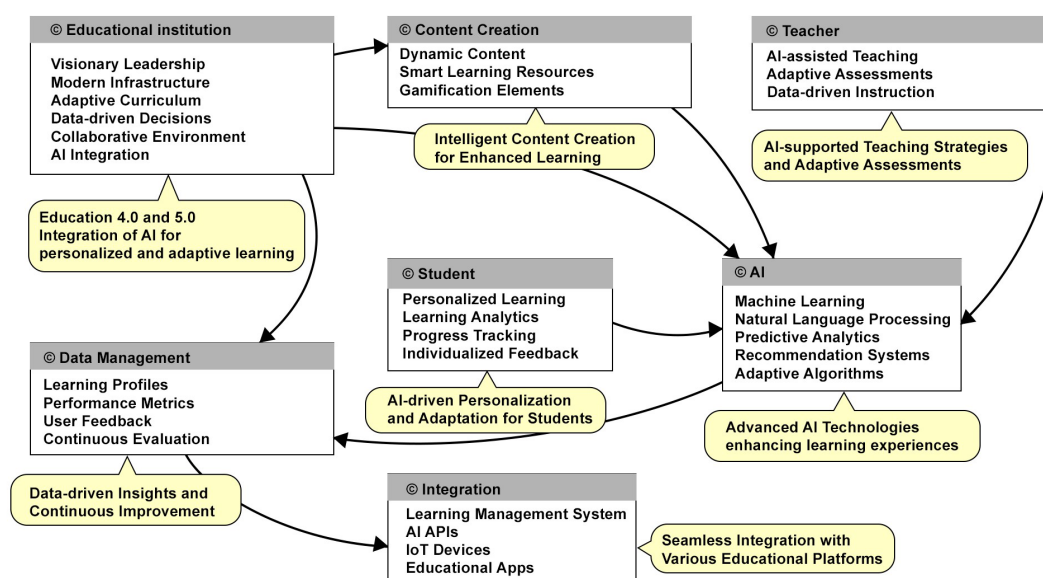


Figure 3. Education 4.0 and 5.0 that integrating Artificial Intelligence (AI) for personalized and adaptive learning.

Artificial Intelligence in education 5.0

Artificial Intelligence (AI) has undergone continuous evolution, making significant advancements across various domains, with education experiencing a notable impact. The following are key areas where AI is significantly impacting the field.

Personalized and adaptive learning

AI in Education 5.0 places a strong emphasis on tailored and adaptive learning experiences [15,16]. Advanced AI algorithms analyze individual learning patterns, preferences, and performance data to dynamically customize content [81-85]. This ensures that each student receives a personalized curriculum suited to their learning style and pace.

Intelligent learning assistants

In AI in Education 5.0, Intelligent Learning Assistants (ILAs) play a central role in the educational process. Fueled by natural language processing and machine learning, ILAs assist students in comprehending complex concepts, addressing queries, and providing real-time feedback [86-92]. They act as virtual tutors, enhancing the overall learning experience.

Predictive analytics for early intervention

A key feature of AI in Education 5.0 is the integration of predictive analytics for early intervention. AI algorithms analyze historical data and patterns to identify potential learning gaps or challenges. Educators can then intervene proactively to offer additional support, ensuring students stay on track with their learning objectives.

Augmented reality (AR) and virtual Reality (VR) integration

AI in Education 5.0 incorporates augmented reality (AR) and virtual reality (VR) to create immersive learning experiences

[35,38]. These technologies go beyond traditional methods, enabling students to interact with educational content in three-dimensional spaces, enhancing engagement, and deepening understanding of complex subjects.

Gamification and simulation

Gamification elements and simulations are seamlessly integrated into the learning process in AI in Education 5.0 [93-97]. By incorporating game-like elements, educational platforms motivate students and make learning enjoyable. Simulations provide practical, hands-on experiences in virtual environments, particularly beneficial for subjects requiring real-world application, such as science and engineering.

Lifelong learning and skill development

Recognizing the importance of lifelong learning and skill development, AI in Education 5.0 designs personalized learning pathways not only for academic success but also for essential skill development needed in the 21st-century workforce [76,79].

Ethical AI and inclusive education

Ethical considerations and inclusivity are paramount in AI in Education 5.0. The development and deployment of AI like systems adhere to principles that prioritize fairness, transparency, and accountability [98-102]. Efforts are made to ensure AI-driven educational tools cater to diverse learning needs without perpetuating biases.

Future prospects

AI in Education 5.0 holds immense potential for transforming learning and teaching methodologies. As technology advances, the integration of AI in education is expected to become more sophisticated. Future prospects are given in Table 2 [103-114].

Table 2. Future directions of ai in education 5.0: emerging technologies and their impacts.

Future trends	Description
Quantum Computing in Education	The emergence of quantum computing could revolutionize AI's capabilities in education, solving complex problems at unprecedented speeds, paving the way for personalized learning and advanced research.
Brain-Computer Interface (BCI) Integration	The integration of Brain-Computer Interface technology with AI in education could enable direct communication between the human brain and computers, fostering more intuitive and immersive learning experiences.
Global Collaboration through AI	AI in Education 5.0 could facilitate global collaboration by connecting students and educators worldwide through virtual classrooms, creating a diverse and enriching learning environment.
Emotional Intelligence and Well-being	Future iterations may focus on incorporating emotional intelligence algorithms into AI in education to understand and respond to students' emotional states, enhancing overall well-being through personalized support.
Augmented Human Intelligence	The convergence of AI and human intelligence could lead to augmented human intelligence, where AI complements and enhances human cognitive abilities, resulting in breakthroughs in problem-solving, critical thinking, and creativity.

Education 4.0, 5.0, and AI

Education 5.0 marks a significant advancement in educational methodologies, building upon the principles of Education 4.0 while introducing innovative approaches and technologies. At

its core, Education 5.0 integrates advanced artificial Intelligence (AI) systems, revolutionizing the learning process [1,7]. Unlike its predecessor, where AI served mainly as a supplementary tool for personalized learning and data analysis, Education 5.0 positions AI as a central element that fundamentally transforms

how knowledge is acquired, processed, and utilized. A notable distinction between Education 4.0 and 5.0 is the increased sophistication and widespread use of AI applications [5,6]. In Education 4.0, AI primarily aided administrative tasks, assessments, and personalized learning recommendations based on student data. However, in Education 5.0, AI-driven technologies are pervasive across the educational landscape, influencing curriculum design, content delivery, student engagement, and assessment. AI algorithms dynamically adjust learning paths based on individual student progress, preferences, and learning styles, resulting in highly personalized learning experiences [6,9]. Additionally,

Education 5.0 leverages AI to promote collaborative and experiential learning environments. In contrast to the passive learning approach of Education 4.0, where students received information passively, Education 5.0 prioritizes interactive, hands-on learning facilitated by AI-driven virtual environments, simulations, and immersive technologies. These tools enable students to actively engage with course materials, experiment with complex concepts, and collaborate with peers in virtual settings, transcending the constraints of physical classrooms. Table 3 shows the Education 4.0, 5.0, and AI for personalized and adaptive learning.

Table 3. Education 4.0, 5.0, and Artificial Intelligence (AI) for personalized and adaptive learning.

Sr. No.	Aspect	Education 4.0	Education 5.0
1	Description	Education 4.0 involves the integration of technology into traditional teaching methods, with a focus on enhancing digital literacy and connectivity.	Education 5.0 signifies a further evolution beyond mere technology integration, emphasizing the implementation of personalized and adaptive learning through the utilization of Artificial Intelligence (AI).
2	Emphasis	Education 4.0 emphasizes technology-enabled learning, digital classrooms, and the utilization of tools for remote learning.	In contrast, Education 5.0 places greater emphasis on AI-driven personalized learning experiences, adaptive curriculum design, and the implementation of intelligent tutoring systems.
3	Pedagogical Approach	Pedagogical approaches in Education 4.0 include blended learning (a combination of traditional and online methods), flipped classrooms, and Massive Open Online Courses (MOOCs).	Conversely, Education 5.0 emphasizes individualized learning paths, real-time feedback mechanisms, AI-driven assessments, and the provision of virtual mentors.
4	Role of AI	In Education 4.0, AI integration is limited to basic data analytics and rudimentary adaptive learning platforms.	On the other hand, Education 5.0 extensively incorporates AI for the provision of personalized learning paths, predictive analytics, and cognitive computing applications.
5	Personalization	Education 4.0 offers basic customization options based on preferences, learning styles, and progress tracking.	In contrast, Education 5.0 provides deep personalization grounded in learner behavior analysis, cognitive assessments, and emotional intelligence insights.
6	Adaptive Learning	Education 4.0 employs basic adaptive learning systems that adjust content based on user performance.	In comparison, Education 5.0 features advanced adaptive systems capable of dynamically adjusting difficulty levels, pacing, and content delivery in real-time.
7	Assessment	Assessment methods in Education 4.0 typically involve traditional assessments supplemented with basic data-driven insights.	Conversely, Education 5.0 employs AI-driven assessments, providing comprehensive insights into learner progress, competencies, and challenges.
8	Teacher Role	In Education 4.0, teachers primarily serve as facilitators of technology-enabled learning experiences.	However, in Education 5.0, teachers facilitate AI-enhanced personalized learning journeys, leveraging insights gleaned from AI tools.

9	Student Engagement	Education 4.0 enhances student engagement through interactive digital content and collaborative tools.	Meanwhile, Education 5.0 enhances engagement through immersive simulations, gamification, and AI-generated content tailored to individual interests.
10	Learning Analytics	Education 4.0 utilizes basic analytics to track student progress and engagement.	In contrast, Education 5.0 employs advanced analytics powered by AI for predictive modeling,
11	Learning Outcomes	Education 4.0 focuses on improving digital literacy and access to information.	Conversely, Education 5.0 aims to enhance critical thinking skills, problem-solving abilities, and lifelong learning competencies.

Furthermore, Education 5.0 places emphasis on developing critical thinking, problem-solving, and creativity skills, with AI serving as both a facilitator and catalyst [2,7]. Rather than providing answers outright, AI systems encourage students to think critically, analyze data, and generate innovative solutions to real-world challenges. Through adaptive learning algorithms, AI challenges students with increasingly complex tasks, nurturing resilience, adaptability, and a growth mindset. Another distinguishing aspect of Education 5.0 is its focus on lifelong learning and continuous skill development in the face of rapid technological advancement and digital transformation. AI-powered learning platforms and micro-credentialing systems enable individuals to acquire new skills, obtain industry-relevant certifications, and remain competitive in a dynamic job market. Education 5.0 recognizes that learning extends beyond formal institutions and throughout one's life, with AI democratizing access to education and empowering learners of all ages and backgrounds.

AI technologies such as machine learning, natural language processing, and data analytics are essential in facilitating customized and flexible learning experiences in Education 4.0 and 5.0. These technologies enable educational institutions to analyze extensive datasets, recognize patterns, and offer tailored interventions for each learner.

Intelligent tutoring systems (ITS)

Intelligent Tutoring Systems (ITS) utilize AI algorithms to deliver personalized instruction, feedback, and assistance to learners. These systems analyze learner interactions, performance data, and cognitive models to adjust the learning process in real-time. For example, Carnegie Learning's Cognitive Tutor modifies the complexity of math problems based on the student's proficiency level, ensuring an appropriate challenge level.

Personalized learning platforms

Personalized learning platforms utilize AI to provide customized learning paths, content suggestions, and assessments. These platforms analyze learner profiles, preferences, and performance metrics to create personalized learning experiences. Khan Academy, for instance, tailors its content suggestions based on learners' past activities, progress, and interests, promoting engagement and skill mastery.

Adaptive assessment systems

Adaptive assessment systems use AI to administer personalized assessments that adapt to the learner's skill level and knowledge

gaps. These systems employ item response theory and machine learning algorithms to select and present questions suited to the learner's proficiency. Duolingo, for example, employs adaptive quizzes to assess language learners' skills and adjusts the difficulty accordingly based on their responses.

Case Study: DreamBox Learning

DreamBox Learning is an adaptive math program for K-8 students that utilizes AI to provide personalized learning experiences. The platform analyzes each student's interactions, learning preferences, and performance data to deliver tailored math lessons aligned with their individual needs. A study conducted by the Center for Education Policy Research at Harvard University found that students using DreamBox made significantly greater progress in math compared to their peers using traditional instructional methods.

Case Study: Coursera

Coursera, a prominent online learning platform, employs AI algorithms to personalize course recommendations and content delivery for millions of learners worldwide. The platform analyzes user behavior, course completion rates, and feedback to suggest relevant courses and learning paths tailored to each learner's goals and interests. Coursera's adaptive learning features have contributed to higher engagement, satisfaction, and completion rates among learners.

Case Study: Squirrel AI Learning

Squirrel AI Learning is an AI-powered adaptive learning platform that offers personalized tutoring and homework support to K-12 students. The platform employs machine learning algorithms and cognitive models to diagnose students' strengths, weaknesses, and learning preferences. A randomized controlled trial found that students using Squirrel AI achieved significantly higher test scores in math and Chinese language compared to those receiving traditional classroom instruction.

Artificial Intelligence technologies for personalized learning

The field of education has undergone significant transformation due to Artificial Intelligence (AI) technologies, with a notable impact on personalized learning. Personalized learning utilizes AI to tailor educational experiences according to the unique needs, preferences, and abilities of individual students [18,32,33]. Recognizing the diversity in learning styles and paces, AI technologies facilitate the creation of adaptive and customized learning environments.

Adaptive learning systems

At the forefront of personalized education, adaptive learning systems employ AI algorithms to analyze students' performance data and dynamically adjust learning content in real-time. Such adaptation is based on individual strengths and weaknesses, ensuring a customized experience [18,22,115-119]. By continuously assessing progress, these systems provide tailored support in challenging areas or present more advanced content for high achievers, fostering an efficient and engaging learning environment.

Intelligent Tutoring Systems (ITS)

Intelligent Tutoring Systems, powered by AI, emulate human tutors by assessing learners' abilities, tailoring instruction, and providing personalized feedback [120-125]. Machine learning algorithms understand students' learning styles, preferences, and performance history, enabling tailored guidance across subjects [28-30]. ITS addresses misconceptions, reinforces concepts, and ensures a deeper understanding of the material.

Natural Language Processing (NLP):

NLP, a branch of AI, enables machines to understand, interpret, and generate human language. In personalized learning, NLP contributes to applications like chatbots and virtual assistants, creating interactive and conversational learning environments [87-89]. Language learning applications, adapting to individual proficiency levels, offer exercises and content suitable for skill development.

Machine learning for predictive analytics

Machine learning algorithms analyze extensive data to identify patterns and predict future outcomes [28,29]. In education, predictive analytics forecast a student's performance, learning trajectory, and potential challenges [126-131]. Early warnings allow educators to intervene and provide additional support, addressing learning gaps and enhancing overall student success.

Gamification and personalized learning paths

AI technologies gamify education by incorporating game elements into the learning process to enhance engagement and motivation [94-75]. Tracking progress, preferences, and performance, AI like technology can adjust difficulty levels, introduces challenges, and provides targeted feedback [15,132-136]. Personalized learning paths allow students to explore content aligned with their interests and objectives.

Personalized content recommendations

AI-driven recommendation systems analyze students' learning history, preferences, and performance data to suggest personalized content. This keeps the learning experience relevant and engaging, encouraging exploration of diverse topics for a holistic educational experience.

Adaptive learning models

Adaptive learning models play a crucial role in shaping the trajectory of education, particularly within the realms of Education 4.0 and Education 5.0 [137-140]. These models harness cutting-edge technologies to individualize the learning experience, tailoring it to the distinctive needs and pace of each learner. Within Education 4.0, adaptive learning models employ artificial Intelligence (AI) and machine learning algorithms to customize learning experiences for individual students. These models scrutinize data on student performance, preferences,

and learning styles to dynamically adjust content, pacing, and instructional difficulty [141-148].

Personalization and customization

A pivotal aspect of adaptive learning in Education 4.0 is personalization. Students traverse customized learning paths, enabling them to advance at their own pace. Real-time data is utilized by adaptive learning systems to identify areas of excellence and those requiring additional focus, ensuring a more effective utilization of study time.

Real-time feedback and assessment

Adaptive learning models furnish instantaneous feedback on student performance, empowering learners to monitor their progress and comprehend their strengths and weaknesses. This real-time assessment allows educators to promptly intervene when students encounter challenges, providing targeted support.

Gamification and immersive experiences

To heighten engagement, numerous adaptive learning platforms incorporate gamification elements, transforming the learning process into an interactive and enjoyable experience. Gamified features, including rewards, leaderboards, and immersive simulations, motivate students to actively participate in their educational journey.

Data-Driven decision making

Education 4.0 underscores the significance of data in decision-making processes. Adaptive learning models generate valuable insights into student behavior, preferences, and performance trends. Educators can leverage this data to make informed decisions about curriculum design, instructional strategies, and resource allocation.

Education 5.0 builds upon the foundation of Education 4.0 but places a greater emphasis on the human aspect of education. It envisions a learning ecosystem that extends beyond technical skills, focusing on holistic development, critical thinking, creativity, and emotional intelligence. Adaptive learning models in Education 5.0 elevate personalization by not only adapting to individual learning styles but also considering the broader context of a student's socio-emotional well-being. These models align with the human-centric approach, recognizing the diverse needs and aspirations of each learner.

Holistic development and lifelong learning

Education 5.0 acknowledges the importance of cultivating well-rounded individuals capable of adapting to a rapidly changing world. Adaptive learning models support lifelong learning by nurturing skills such as problem-solving, critical thinking, collaboration, and adaptability, fostering a continuous learning mindset beyond traditional classroom settings.

Social and Emotional Learning (SEL)

In contrast to previous education paradigms, Education 5.0 places a strong emphasis on social and emotional learning [149-153]. Adaptive learning models incorporate features that assess and address students' emotional well-being, providing support and resources to help them develop essential life skills like resilience, empathy, and self-awareness.

Collaborative learning environments

In Education 5.0, adaptive learning extends beyond

individualized paths to encompass collaborative learning experiences. These models facilitate group activities, projects, and discussions, promoting teamwork and communication skills. The adaptability of the system ensures that collaborative activities align with each student's unique learning journey.

Challenges and Potential Solutions

Education 4.0 and 5.0 signify the incorporation of advanced technologies such as artificial intelligence (AI) into the educational realm to enhance customized and adaptable learning experiences. However, the integration of AI into education presents several hurdles. One potential resolution involves the development of robust AI algorithms capable of accurately evaluating individual student requirements and tailoring learning experiences accordingly. This necessitates the utilization of machine learning techniques to analyze extensive datasets, including student performance, preferences, and learning styles, to create personalized learning paths. Moreover, it is crucial to establish comprehensive data privacy and security frameworks to tackle concerns related to the gathering and utilization of sensitive student data in AI-driven educational platforms. Enforcing stringent protocols for data anonymization, encryption, and user consent can help protect student privacy while facilitating effective AI-driven personalized learning.

The collaboration among educators, technologists, policymakers, and industry stakeholders is vital for devising and implementing efficient AI-integrated educational solutions. Interdisciplinary collaborations can foster the creation of innovative tools and approaches for leveraging AI to improve teaching and learning outcomes while addressing ethical, social, and cultural considerations. Additionally, investing in teacher professional development programs is essential to ensure educators possess the requisite skills and knowledge to effectively employ AI tools in the classroom. Training initiatives should concentrate on helping teachers comprehend how AI can complement traditional teaching methods, offering them the necessary resources and assistance to integrate AI-driven technologies into their teaching practices. Furthermore, promoting equitable access to AI-enabled educational resources is crucial for reducing disparities in learning outcomes. This entails addressing digital divide issues by ensuring all students have access to reliable internet connectivity and suitable hardware devices. Additionally, designing AI-powered platforms with inclusivity in mind, considering factors such as language diversity, disabilities, and socioeconomic backgrounds, can help ensure that personalized learning benefits extend to all students. Lastly, fostering a culture of experimentation and innovation within educational institutions is essential for driving continuous improvement in AI-integrated learning environments. Encouraging educators to experiment with various AI tools and instructional strategies, while providing support and opportunities for peer collaboration and knowledge sharing, can help identify best practices and optimize the use of AI for personalized and adaptable learning. Through a multifaceted approach that addresses technological, pedagogical, ethical, and social dimensions, education systems can overcome challenges and unlock the full potential of AI for personalized and adaptive learning in the era of Education 4.0 and 5.0.

Future Work

Despite the promising prospects of AI integration in education, several areas require further exploration and research. Firstly, ethical considerations must be addressed to ensure responsible AI implementation in educational settings, including transparency, fairness, and accountability in AI algorithms and decision-making processes. Efforts to mitigate biases in AI systems and safeguard student data privacy are crucial to building trust and promoting inclusivity. Moreover, research should prioritize bridging the digital divide to ensure equitable access to AI-driven educational technologies for all learners. This entails initiatives to narrow the technology and internet access gap, particularly in marginalized communities. Additionally, studies investigating the effectiveness of AI in fostering lifelong learning and skill development, as well as its impact on socio-emotional well-being, are necessary to inform future educational practices. Furthermore, future research should explore innovative AI applications, such as quantum computing and brain-computer interface integration, in education to enhance personalized learning experiences and cognitive development. Collaborative efforts among researchers, educators, policymakers, and technology developers are essential to fully leverage AI's potential in shaping the future of education and preparing learners for success in an ever-changing world.

Conclusions

The integration of Artificial Intelligence (AI) into the field of education signifies a profound transition from traditional pedagogical methods to the realms of Education 4.0 and 5.0. Education 4.0 marks a substantial departure from conventional approaches, harnessing advanced technologies to establish more interactive, flexible, and learner-centric environments. The integration of AI in this phase empowers educators to tailor content and delivery according to individual learning styles, preferences, and pacing. Personalized learning, a cornerstone of Education 4.0, ensures that students encounter customized educational experiences, thereby enhancing engagement and comprehension. AI-fueled adaptive learning systems dynamically adjust content and activities based on each learner's progress, fostering a more effective and efficient learning journey. The impact of Education 4.0 extends beyond the classroom, permeating the entire educational ecosystem.

From smart classrooms to online platforms, the integration of AI democratizes access to quality education, dismantling geographical barriers and catering to diverse learning needs. This phase lays the foundation for a more inclusive and equitable educational landscape. Building upon the achievements of Education 4.0, Education 5.0 envisions a holistic and synergistic convergence of human and artificial intelligence. This phase transcends mere technological utilization and underscores the necessity for a harmonious coexistence between humans and AI. It advocates for the development of uniquely human skills, such as critical thinking, creativity, emotional intelligence, and complex problem-solving, recognizing that these qualities complement the capabilities of AI. The concept of "augmented intelligence" takes center stage in Education 5.0, wherein AI serves as a supportive partner, enhancing human capacities rather than replacing them. The human touch in education becomes more pronounced, emphasizing mentorship, collaboration, and the

cultivation of social skills. While AI handles routine tasks and provides personalized learning experiences, educators can dedicate more time to nurturing the holistic development of students. Ethical considerations, data privacy, and the digital divide are critical aspects that require careful attention. Ensuring transparency, impartiality, and adherence to ethical standards in AI systems is paramount. Additionally, addressing concerns related to data security and privacy is imperative to build trust among stakeholders. The digital divide remains a significant barrier, with discrepancies in technology and internet access affecting marginalized communities. Education 5.0 must strive for inclusivity, ensuring that the benefits of AI in education are accessible to all, irrespective of socio-economic backgrounds.

Disclosure statement

No potential conflict of interest was reported by the author.

References

1. Verma A, Anand D, Singh A, Vij R, Alharbi A, Alshammari M, et al. IoT-Inspired Reliable Irregularity-Detection Framework for Education 4.0 and Industry 4.0. *Electronics* (Switzerland). 2022;11(9):1436. <https://doi.org/10.3390/electronics11091436>
2. Noh SC, Karim AMA. Design thinking mindset to enhance education 4.0 competitiveness in Malaysia. *Int J Eval Res Educ*. 2021;10(2):494-501. <https://doi.org/10.11591/ijere.v10i2.20988>
3. Mukul E, Büyükoçkan G. Digital transformation in education: A systematic review of education 4.0. *Technol Forecast Soc Change*. 2023;194:122664. <https://doi.org/10.1016/j.techfore.2023.122664>
4. Moraes EB, Kipper LM, Hackenhaar Kellermann AC, Austria L, Leivas P, Moraes JAR, et al. Integration of Industry 4.0 technologies with Education 4.0: advantages for improvements in learning. *Interact Technol Smart Educ*. 2023;20(2):271-287. <https://doi.org/10.1108/ITSE-11-2021-0201>
5. Shahroom AA, Hussin N. Industrial revolution 4.0 and education. *Int J Acad Res Bus Soc Sci*. 2018;8(9):314-319. <https://doi.org/10.6007/ijarbs.v8-i9/4593>
6. Himmetoglu B, Ayduğ D, Bayrak C. Education 4.0: Defining the teacher, the student, and the school manager aspects of the revolution. *Turkish Online J Distance Educ*. 2020;21:12-28. <https://doi.org/10.17718/TOJDE.770896>
7. Kim J. The interconnectivity of heutagogy and education 4.0 in higher online education. *Can J Learn Technol*. 2022;48(4):1-7. <https://doi.org/10.21432/cjlt28257>
8. Ramírez-Montoya MS, Loaiza-Aguirre MI, Zúñiga-Ojeda A, Portuguez-Castro M. Characterization of the teaching profile within the framework of education 4.0. *Future Internet*. 2021;13(4):91. <https://doi.org/10.3390/fi13040091>
9. Chakraborty S, Gonzalez-Triana Y, Mendoza J, Galatro D. Insights on mapping industry 4.0 and education 4.0. *Front Educ*. 2023;8:1150190. <https://doi.org/10.3389/educ.2023.1150190>
10. Alda R, Boholano H, Dayagbil F. Teacher education institutions in the philippines towards education 4.0. *Int J Learn Teach Educ Res*. 2020;19(8):137-154. <https://doi.org/10.26803/ijlter.19.8.8>
11. Hariharasudan A, Kot S. A scoping review on digital english and education 4.0 for industry 4.0. *Soc Sci*. 2018;7(11):227. <https://doi.org/10.3390/socsci7110227>
12. González-pérez LI, Ramírez-montoya MS. Components of education 4.0 in 21st century skills frameworks: systematic review. *Sustainability*. 2022;14(3):1493. <https://doi.org/10.3390/su14031493>
13. Almeida F, Simoes J. The role of serious games, gamification and industry 4.0 tools in the education 4.0 paradigm. *Contemp Educ Technol*. 2019;10(2):120-136. <https://doi.org/10.30935/cet.554469>
14. Oliveira KK, De Souza RA. Digital transformation towards education 4.0. *Inform Educ*. 2022;21(2):283-309. <https://doi.org/10.15388/infedu.2022.13>
15. Miranda J, Navarrete C, Noguez J, Molina-Espinosa JM, Ramírez-Montoya MS, Navarro-Tuch SA, et al. The core components of education 4.0 in higher education: Three case studies in engineering education. *Comput Electr Eng*. 2021;93:107278. <https://doi.org/10.1016/j.compeleceng.2021.107278>
16. Gajek A, Fabiano B, Laurent A, Jensen N. Process safety education of future employee 4.0 in Industry 4.0. *J Loss Prev Process Ind*. 2022;75:104691. <https://doi.org/10.1016/j.jlp.2021.104691>
17. Lamerás P, Arnab S. Power to the teachers: an exploratory review on artificial intelligence in education. *information*. 2021;13(1):14. <https://doi.org/10.3390/info13010014>
18. Huang X. Aims for cultivating students' key competencies based on artificial intelligence education in China. *Educ Inf Technol*. 2021;26(5):5127-5147. <https://doi.org/10.1007/s10639-021-10530-2>
19. Levin BA, Piskunov AA, Poliakov VY, Savin AV. Artificial intelligence in engineering education. *Vyssh Obraz Ross*. 2022;31(7):79-95. <https://doi.org/10.31992/0869-3617-2022-31-7-79-95>
20. Qu J, Zhao Y, Xie Y. Artificial intelligence leads the reform of education models. *Syst Res Behav Sci*. 2022;39(3):581-588. <https://doi.org/10.1002/sres.2864>
21. Kwon J. A study on ethical awareness changes and education in artificial intelligence society. *Rev Intell Artif*. 2023;37(2):341. <https://doi.org/10.18280/ria.370212>
22. Chen L, Chen P, Lin Z. Artificial intelligence in education: a review. *IEEE Access*. 2020;8:75264-75278. <https://doi.org/10.1109/ACCESS.2020.2988510>
23. Rios-Campos C, Cánova ESM, Zaguinola IRA, Zaguinola HEA, Vargas DJC, Peña WS, et al. Artificial intelligence and education. *South Florida J Dev*. 2023;4(2):641-655. <https://doi.org/10.46932/sfjdv4n2-001>
24. González RAG, Bonilla MHS. Education and artificial intelligence: immersive theme nodes. *Educat*. 2022;82:59-77. <https://doi.org/10.21556/educ.2022.82.2633>
25. Ouyang F, Jiao P. Artificial intelligence in education: The three paradigms. *Comput Educ Artif Intell*. 2021;2:100020. <https://doi.org/10.1016/j.caeai.2021.100020>
26. Sanusi IT, Olaleye SA, Agbo FJ, Chiu TKE. The role of learners' competencies in artificial intelligence education. *Comput Educ Artif Intell*. 2022;3:100098. <https://doi.org/10.1016/j.caeai.2022.100098>
27. Tedre M, Toivonen T, Kahila J, Vartiainen H, Valtanen T, Jormanainen I, et al. Teaching machine learning in K-12 Classroom: Pedagogical and technological trajectories for artificial intelligence education. *IEEE Access*. 2021;9:110558-110572. <https://doi.org/10.1109/ACCESS.2021.3097962>
28. Kolachalama VB. Machine learning and pre-medical education. *Artif Intell Med*. 2022;129:102313. <https://doi.org/10.1016/j.artmed.2022.102313>
29. Cardona T, Cudney EA, Hoerl R, Snyder J. Data mining and machine learning retention models in higher education. *J Coll Student Retent*. 2023;25(1):51-75. <https://doi.org/10.1177/1521025120964920>
30. Luan H, Tsai CC. A review of using machine learning approaches for precision education. *Educ Technol Soc*. 2021;24(1):250-266.
31. Fiebrink R. Machine learning education for artists, musicians, and other creative practitioners. *ACM Trans Comput Educ*. 2019;19(4):1-32. <https://doi.org/10.1145/3294008>
32. Combrink HME, Marivate V, Masikisiki B. Technology-enhanced learning, data sharing, and machine learning challenges in south african education. *Educ Sci*. 2023;13(5):438. <https://doi.org/10.3390/educsci13050438>
33. Malik A, Onyema EM, Dalal S, Lilhore UK, Anand D, Sharma A, et al. Forecasting students' adaptability in online entrepreneurship education using modified ensemble machine learning model. *Array*. 2023;19:100303. <https://doi.org/10.1016/j.array.2023.100303>
34. Zhang W, Wang Z. Theory and practice of vr/ar in k-12 science

- education—a systematic review. *Sustainability*. 2021;13(22):12646. <https://doi.org/10.3390/su132212646>
35. Dzyuba N, Jandu J, Yates J, Kushnerev E. Virtual and augmented reality in dental education: The good, the bad and the better. *Eur J Dent Educ*. 2022. <https://doi.org/10.1111/eje.12871>
36. Sanfilippo F, Blazauskas T, Salvietti G, Ramos I, Vert S, Radianti J, et al. A perspective review on integrating vr/ar with haptics into stem education for multi-sensory learning. *Robotics*. 2022;11(2):41. <https://doi.org/10.3390/robotics11020041>
37. Joo HJ, Jeong HY. A study on eye-tracking-based Interface for VR/AR education platform. *Multimed Tools Appl*. 2020;79(23):16719-16730. <https://doi.org/10.1007/s11042-019-08327-0>
38. Fitria TN. Augmented reality (ar) and virtual reality (vr) technology in education: media of teaching and learning: a review. *Int J Comput Inf Syst*. 2023;04(01):14-25.
39. Al-Ansi AM, Jaboo M, Garad A, Al-Ansi A. Analyzing augmented reality (AR) and virtual reality (VR) recent development in education. *Soc Sci Humanit Open*. 2023;8(1):100532. <https://doi.org/10.1016/j.ssaho.2023.100532>
40. Tan Y, Xu W, Li S, Chen K. Augmented and virtual reality (ar/vr) for education and training in the aec industry: a systematic review of research and applications. *Buildings*. 2022;12(10):1529. <https://doi.org/10.3390/buildings12101529>
41. Chen X, Zou D, Xie H, Cheng G, Liu C. Two decades of artificial intelligence in education: contributors, collaborations, research topics, challenges, and future directions. *Educ Technol Soc*. 2022;25(1):28-47.
42. Chiu TKF, Xia Q, Zhou X, Chai CS, Cheng M. Systematic literature review on opportunities, challenges, and future research recommendations of artificial intelligence in education. *Comput Educ Artif Intell*. 2023;4:100118. <https://doi.org/10.1016/j.caeai.2022.100118>
43. Hwang GJ, Xie H, Wah BW, Gašević D. Vision, challenges, roles and research issues of artificial intelligence in education. *Comput Educ Artif Intell*. 2020;1:100001. <https://doi.org/10.1016/j.caeai.2020.100001>
44. Francesc Pedró. Applications of artificial intelligence to higher education: possibilities, evidence, and challenges. *IUL Res*. 2022;1(1):61-76. <https://doi.org/10.57568/iulres.v1i1.43>
45. Alkhulaifat D, Rafful P, Khalkhali V, Welsh M, Sotardi ST. Implications of pediatric artificial intelligence challenges for artificial intelligence education and curriculum development. *J Am Coll Radiol*. 2023;20(8):724-729. <https://doi.org/10.1016/j.jacr.2023.04.013>
46. Tao HB, Diaz VR, Guerra YM. Artificial intelligence and education challenges and disadvantages for the teacher. *Arctic J*. 2019;72(12):30-50.
47. Su J, Ng DTK, Chu SKW. Artificial intelligence (ai) literacy in early childhood education: the challenges and opportunities. *Comput Educ Artif Intell*. 2023;4:100124. <https://doi.org/10.1016/j.caeai.2023.100124>
48. Pedró F. Artificial intelligence in education: challenges and opportunities for sustainable development. UNESCO; 2019.
49. Vázquez-Cano E. Artificial intelligence and education: A pedagogical challenge for the 21st century. *Educ Process Int J*. 2021;10(3): 7-12. <https://doi.org/10.22521/EDUPIJ.2021.103.1>
50. Akinwalere SN, Ivanov V. Artificial intelligence in higher education: challenges and opportunities. *Border Cross*. 2022;12(1):1-5. <https://doi.org/10.33182/bc.v12i1.2015>
51. Alam T, Benaïda M. Blockchain and internet of things in higher education. *Univ J Educ Res*. 2020;8(5):2164-2174. <https://doi.org/10.13189/ujer.2020.080556>
52. Li H. Application of an internet of things oriented network education platform in english language teaching. *Adv Multimedia*. 2022. <https://doi.org/10.1155/2022/9651028>
53. Zeeshan K, Hämäläinen T, Neittaanmäki P. Internet of things for sustainable smart education: an overview. *Sustainability*. 2022;14(7). <https://doi.org/10.3390/su14074293>
54. Al-Taai SHH, Kanber HA, Al-Dulaimi WAM. The importance of using the internet of things in education. *Int J Emerg Technol Learn*. 2023;18(1). <https://doi.org/10.3991/ijet.v18i01.35999>
55. Wang S. Application of internet of things framework in physical education system. *J Internet Technol*. 2022;23(2):307-320. <https://doi.org/10.53106/160792642022032302011>
56. Uspabayeva A, Sattarova A, Mirza N, Kubeeva M, Abdualievich ZK, Rysbayeva G. Evaluation of high school students' new trends in education: internet of things. *Int J Emerg Technol Learn*. 2022;17(19). <https://doi.org/10.3991/ijet.v17i19.32183>
57. Ocheja P, Agbo FJ, Oyelere SS, Flanagan B, Ogata H. Blockchain in education: a systematic review and practical case studies. *IEEE Access*. 2022;10. <https://doi.org/10.1109/ACCESS.2022.3206791>
58. Gong X, Liu X, Jing S, Xiong G, Zhou J. Parallel-education-blockchain driven smart education: challenges and issues. *Proc 2018 Chinese Autom Congr*. 2019:2390-2395. <https://doi.org/10.1109/CAC.2018.8623198>
59. Alammary A, Alhazmi S, Almasri M, Gillani S. Blockchain-based applications in education: A systematic review. *Appl Sci*. 2019;9(12):2400. <https://doi.org/10.3390/app9122400>
60. Ocheja P, Flanagan B, Ogata H, Oyelere SS. Visualization of education blockchain data: trends and challenges. *Interact Learn Environ*. 2023;31(9):5970-5994. <https://doi.org/10.1080/10494820.2022.2026406>
61. Iyer S, Jain SP, Subramanian S, Jain ISP. Adopting a Student Centric Education Blockchain System. *Int J Inf Commun Sci*. 2022;7(3):48-65. <https://doi.org/10.11648/j.ijics.20220703.11>
62. Park J. Promises and challenges of blockchain in education. *smart learn environ*. 2021;8(1):33. <https://doi.org/10.1186/s40561-021-00179-2>
63. Rane NL, Achari A, Choudhary SP, Mallick SK, Pande CB, Srivastava A, et al. A decision framework for potential dam site selection using GIS, MIF and TOPSIS in Ulhas river basin, India. *J Clean Prod*. 2023;138890. <https://doi.org/10.1016/j.jclepro.2023.138890>
64. Rane NL, Achari A, Saha A, Poddar I, Rane J, Pande CB, et al. An integrated GIS, MIF, and TOPSIS approach for appraising electric vehicle charging station suitability zones in Mumbai, India. *Sustain Cities Soc*. 2023;104717. <https://doi.org/10.1016/j.scs.2023.104717>
65. Gautam VK, Pande CB, Moharir KN, Varade AM, Rane NL, Egbueri JC, et al. Prediction of sodium hazard of irrigation purpose using artificial neural network modelling. *Sustainability*. 2023;15(9):7593. <https://doi.org/10.3390/su15097593>
66. Rane NL, Anand A, Deepak K. Evaluating the selection criteria of formwork system (fs) for rcc building construction. *Int J Eng Trends Technol*. 2023;71(3):197-205. <https://doi.org/10.14445/22315381/IJETT-V71I3P220>
67. Rane NL, Achari A, Hashemizadeh A, Phalak S, Pande CB, Giduturi M, et al. Identification of sustainable urban settlement sites using interrelationship based multi-influencing factor technique and GIS. *Geocarto Int*. 2023;1-27. <https://doi.org/10.1080/10106049.2023.2272670>
68. Crescenzi-Lanna L. Literature review of the reciprocal value of artificial and human intelligence in early childhood education. *J Res Technol Educ*. 2023;55(1):21-33. <https://doi.org/10.1080/15391523.2022.2128480>
69. Spector JM. Human and artificial intelligence in education. *Int J Smart Technol Learn*. 2023;3(2):163-167. <https://doi.org/10.1504/ijsmartl.2023.129635>
70. Ahmad SF, Han H, Alam MM, Rehmat MK, Irshad M, Arraño-Muñoz M, et al. Impact of artificial intelligence on human loss in decision making, laziness and safety in education. *Humanit Soc Sci Commun*. 2023;10(1):1-14. <https://doi.org/10.1057/s41599-023-01787-8>
71. Andersen R, Mørch AI, Litherland KT. Collaborative learning with block-based programming: investigating human-centered artificial intelligence in education. *Behav Inf Technol*. 2022;41(9):1830-1847. <https://doi.org/10.1080/0144929X.2022.2083981>

72. Ifenthaler D, Schumacher C. Reciprocal issues of artificial and human intelligence in education. *J Res Technol Educ.* 2023;55(1):1-6. <https://doi.org/10.1080/15391523.2022.2154511>
73. Yang SJH, Ogata H, Matsui T, Chen NS. Human-centered artificial intelligence in education: Seeing the invisible through the visible. *Comput Educ Artif Intell.* 2021;2:100008. <https://doi.org/10.1016/j.caeai.2021.100008>
74. Ninaus M, Sailer M. Closing the loop – The human role in artificial intelligence for education. *Front Psychol.* 2022;13. <https://doi.org/10.3389/fpsyg.2022.956798>
75. Palestina LR. Curriculum implementation towards education 4.0. *Int J Res Publ.* 2021;80(1):126-145. <https://doi.org/10.47119/ijrp100801720212090>
76. Kuzior A. Technological unemployment in the perspective of industry 4.0 development. *Virtual Econ.* 2022;5(1):7-23. [https://doi.org/10.34021/VE.2022.05.01\(1\)](https://doi.org/10.34021/VE.2022.05.01(1))
77. Cuong VT, Le QH. Determining characteristics of teachers, students and educational managers in the 4.0 educational context. *Vietnam J Educ.* 2020;4(4):16-21. <https://doi.org/10.52296/vje.2020.75>
78. Venkatraman S, Benli F, Wei Y, Wahr F. Smart classroom teaching strategy to enhance higher order thinking skills (hots)—an agile approach for education 4.0. *Future Internet.* 2022;14(9):255. <https://doi.org/10.3390/fi14090255>
79. Bonfield CA, Salter M, Longmuir A, Benson M, Adachi C. Transformation or evolution?: Education 4.0, teaching and learning in the digital age. *High Educ Pedagog.* 2020;5(1):223-246. <https://doi.org/10.1080/23752696.2020.1816847>
80. Matsumoto-Royo K, Ramirez-Montoya MS, Conget P. Opportunities to develop lifelong learning tendencies in practice-based teacher education: Getting ready for education 4.0. *Future Internet.* 2021;13(11):292. <https://doi.org/10.3390/fi13110292>
81. Rane NL, Jayaraj GK. Comparison of multi-influence factor, weight of evidence and frequency ratio techniques to evaluate groundwater potential zones of basaltic aquifer systems. *Environ Dev Sustain.* 2022;24(2):2315-2344. <https://doi.org/10.1007/s10668-021-01535-5>
82. Rane N. ChatGPT and similar generative artificial intelligence (ai) for smart industry: role, challenges and opportunities for industry 4.0, industry 5.0 and society 5.0. 2023. <http://dx.doi.org/10.2139/ssrn.4603234>
83. Rane N. Transformers in material science: roles, challenges, and future scope. challenges and future scope. 2023. <http://dx.doi.org/10.2139/ssrn.4609920>
84. Rane N. Contribution of chatgpt and other generative artificial intelligence (ai) in renewable and sustainable energy. 2023. <http://dx.doi.org/10.2139/ssrn.4597674>
85. Rane N. Role of chatgpt and similar generative artificial intelligence (ai) in construction industry. 2023. <http://dx.doi.org/10.2139/ssrn.4598258>
86. Younis HA, Ruhaiyem NIR, Ghaban W, Gazem NA, Nasser M. A systematic literature review on the applications of robots and natural language processing in education. *Electronics.* 2023;12(13):2864. <https://doi.org/10.3390/electronics12132864>
87. Lesage J, Brennan R, Eaton SE, Moya B, McDermott B, Wiens J, et al. Exploring natural language processing in mechanical engineering education: Implications for academic integrity. *Int J Mech Eng Educ.* 2023;52(1):88-105. <https://doi.org/10.1177/03064190231166665>
88. Smith GG, Haworth R, Žitnik S. Computer science meets education: natural language processing for automatic grading of open-ended questions in ebooks. *J Educ Comput Res.* 2020;58(7):1227-1255. <https://doi.org/10.1177/0735633120927486>
89. Chary M, Parikh S, Manini AF, Boyer EW, Radeos M. A review of natural language processing in medical education. *West J Emerg Med.* 2019;20(1):78. <https://doi.org/10.5811/westjem.2018.11.39725>
90. Alqahtani T, Badreldin HA, Alrashed M, Alshaya AI, Alghamdi SS, bin Saleh K, et al. The emergent role of artificial intelligence, natural learning processing, and large language models in higher education and research. *Res Social Adm Pharm.* 2023;19(8):1236-1242. <https://doi.org/10.1016/j.sapharm.2023.05.016>
91. Shaik T, Tao X, Li Y, Dann C, McDonald J, Redmond P, et al. A review of the trends and challenges in adopting natural language processing methods for education feedback analysis. *IEEE Access.* 2022;10:56720-56739. <https://doi.org/10.1109/ACCESS.2022.3177752>
92. Khaled Dr. Natural language processing and its use in education. *Int J Adv Comput Sci Appl.* 2014;5(12). <https://doi.org/10.14569/ijacsa.2014.051210>
93. Utama MMA. PAI learning media in the perspective of abdullah nashih ulwan in the society era 5.0. *Southeast Asian J Islam Educ.* 2022;4(2):249-259. <https://doi.org/10.21093/sajie.v4i2.4607>
94. Ahmad I, Sharma S, Singh R, Gehlot A, Priyadarshi N, Twala B. MOOC 5.0: A Roadmap to the Future of Learning. *Sustainability.* 2022;14(18):11199. <https://doi.org/10.3390/su141811199>
95. Liu T, Oubibi M, Zhou Y, Fute A. Research on online teachers' training based on the gamification design: A survey analysis of primary and secondary school teachers. *Heliyon.* 2023;9(4). <https://doi.org/10.1016/j.heliyon.2023.e15053>
96. Chitra DR. Gamification for education 5.0. In: innovating with augmented reality: applications in education and industry. 2021. <https://doi.org/10.1201/9781003175896-6>
97. Ulliyah H, Sutomo M, Suhardi A. Lectora-based interactive e-module: a solution to develop mathematical logic intelligence of islamic elementary school student in the era society 5.0. *J Ilm PGMI.* 2023;9(1). <https://doi.org/10.19109/jip.v9i1.16954>
98. Rane N. Enhancing the quality of teaching and learning through chatgpt and similar large language models: challenges, future prospects, and ethical considerations in education. 2023. <http://dx.doi.org/10.2139/ssrn.4599104>
99. Rane N. Role and challenges of chatgpt and similar generative artificial intelligence in finance and accounting. 2023. <http://dx.doi.org/10.2139/ssrn.4603206>
100. Rane N. Role and challenges of chatgpt and similar generative artificial intelligence in arts and humanities. 2023. <http://dx.doi.org/10.2139/ssrn.4603208>
101. Rane N. Role and challenges of chatgpt and similar generative artificial intelligence in business management. 2023. <http://dx.doi.org/10.2139/ssrn.4603227>
102. Rane N. Role and challenges of chatgpt and similar generative artificial intelligence in human resource management. 2023. <http://dx.doi.org/10.2139/ssrn.4603230>
103. Rasa T, Palmgren E, Laherto A. Futurising science education: students' experiences from a course on futures thinking and quantum computing. *Instr Sci.* 2022;50(3):425-447. <https://doi.org/10.1007/s11251-021-09572-3>
104. Bungum B, Selstø S. What do quantum computing students need to know about quantum physics?. *Eur J Phys.* 2022;43(5):055706. <https://doi.org/10.1088/1361-6404/ac7e8a>
105. How ML. Advancing multidisciplinary STEM education with mathematics for future-ready quantum algorithmic literacy. *Mathematics.* 2022;10(7):1146. <https://doi.org/10.3390/math10071146>
106. Carberry D, Nourbakhsh A, Karon J, Jones MN, Jadidi M, Shahriari K, et al. Building knowledge capacity for quantum computing in engineering education. *Comput Aided Chem Eng.* 2021;50:2065-2070. <https://doi.org/10.1016/B978-0-323-88506-5.50319-3>
107. Angara PP, Stege U, MacLean A, Müller HA, Markham T. Teaching quantum computing to high-school-aged youth: A hands-on approach. *IEEE Trans Quantum Eng.* 2021;3:1-5. <https://doi.org/10.1109/TQE.2021.3127503>
108. Hou SY, Feng G, Wu Z, Zou H, Shi W, Zeng J, et al. SpinQ Gemini: a desktop quantum computing platform for education and research. *EPJ Quantum Technol.* 2021;8(1):1-23.

- <https://doi.org/10.1140/epjqt/s40507-021-00109-8>
109. Mourtzis D, Angelopoulos J, Panopoulos N. A teaching factory paradigm for personalized perception of education based on extended reality (XR). In Proceedings of the 12th Conference on Learning Factories (CLF 2022) 2022.
<https://doi.org/10.2139/ssrn.4071876>
110. Chavarro D, Perez-Taborda JA, Ávila A. Connecting brain and heart: artificial intelligence for sustainable development. *Scientometrics*. 2022;127(12):7041-7060.
<https://doi.org/10.1007/s11192-022-04299-5>
111. Zhang S, Wang S, Liu R, Dong H, Zhang X, Tai X. A bibliometric analysis of research trends of artificial intelligence in the treatment of autistic spectrum disorders. *Front Psychiatry*. 2022;13:967074.
<https://doi.org/10.3389/fpsy.2022.967074>
112. Castonguay A, Farthing P, Davies S, Vogelsang L, Kleib M, Risling T, et al. Revolutionizing nursing education through AI integration: A reflection on the disruptive impact of ChatGPT. *Nurse Educ Today*. 2023;129:105916.
<https://doi.org/10.1016/j.nedt.2023.105916>
113. Mollura DJ, Culp MP, Pollack E, Battino G, Scheel JR, Mango VL, et al. Artificial intelligence in low-and middle-income countries: innovating global health radiology. *Radiology*. 2020;297(3):513-520. <https://doi.org/10.1148/radiol.2020201434>
114. Crompton H, Song D. The potential of artificial intelligence in higher education. *Rev virtual univ catol norte*. 2021;62.
<https://doi.org/10.35575/rvucn.n62a1>
115. Rane N. Enhancing mathematical capabilities through ChatGPT and similar generative artificial intelligence: Roles and challenges in solving mathematical problems. 2023.
<http://dx.doi.org/10.2139/ssrn.4603237>
116. Rane N. Transforming structural engineering through chatgpt and similar generative artificial intelligence: roles, challenges, and opportunities. *Challenges, and Opportunities*. 2023.
<http://dx.doi.org/10.2139/ssrn.4603242>
117. Patil DR, Rane NL. Customer experience and satisfaction: importance of customer reviews and customer value on buying preference. *Int Res J Modern Eng Technol Sci*. 2023;5(3):3437-3447.
<https://www.doi.org/10.56726/IRJMETS36460>
118. Rane N. Roles and challenges of ChatGPT and similar generative artificial intelligence for achieving the sustainable development goals (SDGs). <http://dx.doi.org/10.2139/ssrn.4603244>
119. Rane NL. Multidisciplinary collaboration: key players in successful implementation of ChatGPT and similar generative artificial intelligence in manufacturing, finance, retail, transportation, and construction industry. <https://doi.org/10.31219/osf.io/npm3d>
120. Ahuja NJ, Dutt S, Choudhary SL, Kumar M. Intelligent tutoring system in education for disabled learners using human-computer interaction and augmented reality. *Int J Hum Comput*. 2022;27:1-3. <https://doi.org/10.1080/10447318.2022.2124359>
121. Jing S, Tang Y, Liu X, Gong X, Cui W, Liang J. A parallel education based intelligent tutoring systems framework. 2020 IEEE international conference on networking, sensing and control: ICNSC 2020; 2020
<https://doi.org/10.1109/ICNSC48988.2020.9238052>
122. Tafazoli D, María, Parra EG, Abril CAH. Intelligent language tutoring system: Integrating intelligent computer-assisted language learning into language education. *Int J Inf Commun Technol Educ*. 2019;15(3):60-74.
<https://doi.org/10.4018/IJICTE.2019070105>
123. Jagadeesan S, Rao K, Shamim M, Otero-Potosi S, Fuertes-Narváez E, Rao A. AI in education: the potential impact of intelligent tutoring systems and personalized learning. *Eur Chem Bull*. 2023;12:1964-1975.
<http://dx.doi.org/10.31838/ecb/2023.12.s1-B.193>
124. Lin CC, Huang AY, Lu OH. Artificial intelligence in intelligent tutoring systems toward sustainable education: a systematic review. *Smart Learn Environ*. 2023;10(1):41.
<https://doi.org/10.1186/s40561-023-00260-y>
125. Singh N, Gunjan VK, Mishra AK, Mishra RK, Nawaz N. SeisTutor: a custom-tailored intelligent tutoring system and sustainable education. *Sustainability*. 2022;14(7):4167.
<https://doi.org/10.3390/su14074167>
126. de Bruin AB, Dunlosky J, Cavalcanti RB. Monitoring and regulation of learning in medical education: the need for predictive cues. *Med Educ*. 2017;51(6):575-84.
<https://doi.org/10.1111/medu.13267>
127. Herodotou C, Rienties B, Boroowa A, Zdrahal Z, Hlosta M. A large-scale implementation of predictive learning analytics in higher education: The teachers' role and perspective. *Educ Technol Res Dev*. 2019;67:1273-1306.
<https://doi.org/10.1007/s11423-019-09685-0>
128. Bird KA, Castleman BL, Mabel Z, Song Y. Bringing transparency to predictive analytics: A systematic comparison of predictive modeling methods in higher education. *AERA Open*. 2021;7:23328584211037630.
<https://doi.org/10.1177/23328584211037630>
129. Liz-Domínguez M, Caeiro-Rodríguez M, Llamas-Nistal M, Mikic-Fonte FA. Systematic literature review of predictive analysis tools in higher education. *Appl Sci*. 2019;9(24):5569.
<https://doi.org/10.3390/app9245569>
130. Rajni J, Malaya DB. Predictive analytics in a higher education context. *IT Prof*. 2015;17(4):24-33.
<https://doi.org/10.1109/MITP.2015.68>
131. Tete M, Sousa M, Santana T, Felliipe S. Predictive models for higher education dropout: A systematic literature review. *Educ Policy Anal Arch*. 2022;30:149. <https://doi.org/10.14507/EPAA.30.6845>
132. Rane N. Potential role and challenges of chatgpt and similar generative artificial intelligence in architectural engineering. Available at SSRN 4607767. 2023.
<http://dx.doi.org/10.2139/ssrn.4607767>
133. Rane N. Integrating building information modelling (bim) and artificial intelligence (ai) for smart construction schedule, cost, quality, and safety management: challenges and opportunities. cost, quality, and safety management: challenges and opportunities. 2023. <https://dx.doi.org/10.2139/ssrn.4616055>
134. Moharir KN, Pande CB, Gautam VK, Singh SK, Rane NL. Integration of hydrogeological data, GIS and AHP techniques applied to delineate groundwater potential zones in sandstone, limestone and shales rocks of the Damoh district,(MP) central India. *Environ Res*. 2023;228:115832.
<https://doi.org/10.1016/j.envres.2023.115832>
135. Rane N. ChatGPT and similar generative artificial intelligence (ai) for building and construction industry: contribution, opportunities and challenges of large language models for industry 4.0, industry 5.0, and society 5.0. opportunities and challenges of large language models for industry. 2023;4.
<http://dx.doi.org/10.2139/ssrn.4603221>
136. Rane N. Chatbot-enhanced teaching and learning: implementation strategies, challenges, and the role of chatgpt in education. challenges, and the role of chatgpt in education (July 21, 2023). 2023. <https://dx.doi.org/10.2139/ssrn.4603204>
137. Smyrnova-Trybulska E, Morze N, Varchenko-Trotsenko L. Adaptive learning in university students' opinions: Cross-border research. *Educ Inf Technol*. 2022;27(5):6787-818.
<https://doi.org/10.1007/s10639-021-10830-7>
138. Koutsantonis D, Koutsantonis K, Bakas NP, Plevris V, Langousis A, Chatzichristofis SA. Bibliometric literature review of adaptive learning systems. *Sustainability*. 2022;14(19):12684.
<https://doi.org/10.3390/su141912684>
139. Hwang GJ, Sung HY, Chang SC, Huang XC. A fuzzy expert system-based adaptive learning approach to improving students' learning performances by considering affective and cognitive factors. *Comput Educ: Artif Intell*. 2020;1:100003.
<https://doi.org/10.1016/j.caeai.2020.100003>
140. Jing Y, Zhao L, Zhu K, Wang H, Wang C, Xia Q. Research landscape of adaptive learning in education: A bibliometric study on research publications from 2000 to 2022. *Sustainability*.

- 2023;15(4):3115. <https://doi.org/10.3390/su15043115>
141. Mirata V, Hirt F, Bergamin P, van der Westhuizen C. Challenges and contexts in establishing adaptive learning in higher education: findings from a Delphi study. *Int J Educ Technol High Educ*. 2020;17:1-25. <https://doi.org/10.1186/s41239-020-00209-y>
142. Kabudi T, Pappas I, Olsen DH. AI-enabled adaptive learning systems: A systematic mapping of the literature. *Comput Educ: Artif Intell*. 2021;2:100017. <https://doi.org/10.1016/j.caeai.2021.100017>
143. Muñoz JL, Ojeda FM, Jurado DL, Peña PF, Carranza CP, Berrios HQ, et al. Systematic review of adaptive learning technology for learning in higher education. *Eurasian J Educ Res*. 2022;98(98):221-233. <https://doi.org/10.14689/ejer.2022.98.014>
144. Minn S. AI-assisted knowledge assessment techniques for adaptive learning environments. *Comput Educ: Artif Intell*. 2022;3:100050. <https://doi.org/10.1016/j.caeai.2022.100050>
145. Alqahtani R, Kaliappen N, Alqahtani M. A review of the quality of adaptive learning tools over non-adaptive learning tools. *Int J Qual Res*. 2021;15(1):45. <https://doi.org/10.24874/IJQR15.01-03>
146. Clark RM, Kaw AK, Braga Gomes R. Adaptive learning: Helpful to the flipped classroom in the online environment of COVID?. *Comput Appl Eng Educ*. 2022;30(2):517-531. <https://doi.org/10.1002/cae.22470>
147. Wang S, Christensen C, Cui W, Tong R, Yarnall L, Shear L, et al. When adaptive learning is effective learning: comparison of an adaptive learning system to teacher-led instruction. *Interact Learn Environ*. 2023;31(2):793-803. <https://doi.org/10.1080/10494820.2020.1808794>
148. Clements K, West RE, Hunsaker E. Getting started with open badges and open microcredentials. *Int Rev Res Open Distance Learn*. 2020;21(1):154-72. <https://doi.org/10.19173/irrodl.v21i1.4529>
149. Cherewick M, Lebu S, Su C, Richards L, Njau PF, Dahl RE. Adolescent, caregiver and community experiences with a gender transformative, social emotional learning intervention. *Int J equity health*. 2021;20:1-7. <https://doi.org/10.1186/s12939-021-01395-5>
150. Walker G, Venker Weidenbenner J. Social and Emotional Learning in the age of virtual play: technology, empathy, and learning. *J Res Innov Teach Learn*. 2019;12(2):116-132. <https://doi.org/10.1108/JRIT-03-2019-0046>
151. Váradi J. A review of the literature on the relationship of music education to the development of socio-emotional learning. *Sage Open*. 2022;12(1):21582440211068501. <https://doi.org/10.1177/21582440211068501>
152. Schonert-Reichl KA, Weissberg RP. Social and emotional learning. 2014. <https://doi.org/10.1016/B978-0-12-818630-5.14010-2>
153. Ahmed I, Hamzah AB, Abdullah MN. Effect of social and emotional learning approach on students' social-emotional competence. *Int J Instr*. 2020;13(4):663-676. <https://doi.org/10.29333/iji.2020.13441>