



Enhancing Learning Through Intelligent Tutoring System: A Step Towards Smarter Education

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KEYWORD

Intelligent tutoring System; Smart Education; Personalized Learning; Adaptive Learning; Artificial Intelligence; Machine Learning; Educational Technology; Student Engagement; Learning Outcomes; Cognitive Psychology.

ABSTRACT

Intelligent Tutoring Systems (ITS) have emerged as a promising tool for revolutionizing traditional educational paradigms by providing personalized and adaptive learning experiences. This paper explores the role of ITS in enhancing learning outcomes and advancing towards smart education. By leveraging artificial intelligence and machine learning algorithms, ITS can analyze students' learning behaviors, preferences, and performance to tailor instructional content and feedback in real-time. Such personalized interventions have been shown to improve student engagement, motivation, and knowledge retention. Additionally, ITS can facilitate continuous assessment and progress tracking, enabling educators to identify and address learning gaps more effectively. Furthermore, the integration of ITS into educational environments promotes active and self-directed learning, empowering students to take ownership of their learning journey. Despite the numerous benefits, challenges such as designing user-friendly interfaces, ensuring data privacy, and addressing equity concerns need to be addressed for widespread adoption of ITS. This paper concludes by discussing future directions and implications for the integration of ITS into educational practices, emphasizing the transformative potential of ITS in fostering smart education initiatives.

1. INTRODUCTION

1.1. BACKGROUND AND CONTEXT

In the rapidly evolving landscape of education, the integration of technology has become increasingly prevalent, with intelligent tutoring systems (ITS) emerging as a cornerstone of modern pedagogy. Leveraging artificial intelligence (AI) and machine learning algorithms, ITS have revolutionized traditional educational practices by offering personalized and adaptive learning experiences tailored to individual students' needs. This paradigm shift towards personalized learning is a key component of the broader smart education movement, aimed at harnessing technology to optimize educational outcomes and prepare learners for the challenges of the 21st century.

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At the heart of intelligent tutoring systems lies the concept of adaptive learning, wherein instructional content and feedback are dynamically adjusted based on students' learning behaviours, preferences, and performance. By

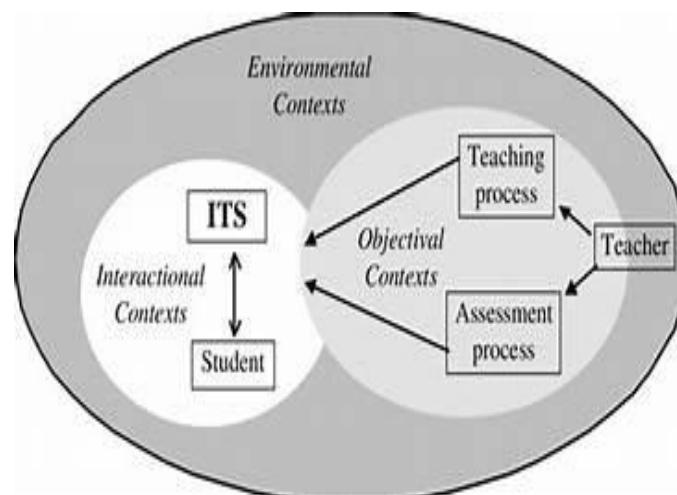


analysing vast amounts of data generated through student interactions, ITS can identify learning gaps, provide targeted interventions, and offer real-time support, thereby enhancing student engagement and facilitating deeper learning experiences. This personalized approach not only caters to diverse learning styles and abilities but also empowers students to take ownership of their learning journey, fostering a sense of autonomy and self-directed learning.

Furthermore, the integration of ITS into educational environments facilitates continuous assessment and progress tracking, enabling educators to gain insights into student mastery of concepts and identify areas for further development. Through adaptive assessments and feedback mechanisms, ITS support formative evaluation practices, enabling teachers to monitor student progress and provide timely interventions as needed. Additionally, intelligent tutoring systems promote collaborative learning experiences by facilitating peer interaction and group collaboration, thereby simulating real-world problem-solving scenarios and promoting the development of essential 21st-century skills such as critical thinking, communication, and collaboration.

1.2SIGNIFICANCE OF THE STUDY

As educational institutions strive to embrace the possibilities of smart education, the adoption of intelligent tutoring systems represents a significant step towards transforming traditional educational paradigms. However, the successful implementation of ITS requires careful consideration of various factors, including infrastructure



readiness, teacher training, and alignment with curriculum standards. Moreover, ongoing research is needed to explore the long-term impact of ITS on student learning outcomes and to identify best practices for maximizing its effectiveness in diverse educational contexts.

In light of these considerations, this paper aims to explore the role of intelligent tutoring systems in enhancing learning experiences and advancing educational outcomes. Through a comprehensive review of existing literature

and case studies, we will examine the potential benefits, challenges, and implications of integrating ITS into educational practices. By shedding light on the transformative potential of ITS, we hope to contribute to the ongoing discourse surrounding the future of education in the digital age.

1.3 OBJECTIVE OF THE RESEARCH

The primary objective of this study is to investigate the role of intelligent tutoring systems (ITS) in enhancing learning outcomes and advancing towards smart education. Specifically, the study aims to:

- Explore the effectiveness of ITS in improving student engagement, motivation, and academic achievement across diverse educational settings.
- Examine the impact of personalized and adaptive learning interventions facilitated by ITS on student learning outcomes, including knowledge retention, skill development, and mastery learning.
- Investigate the implementation strategies and best practices for



integrating ITS into educational environments, including infrastructure readiness, teacher training, and curriculum alignment.

- Evaluate the ethical considerations and data privacy concerns associated with the use of ITS in educational settings, and propose guidelines for ensuring equity, fairness, and security.
- Identify opportunities for future research and practice in the field of intelligent tutoring systems, including emerging trends, innovative applications, and policy implications for smart education initiatives.

By addressing these objectives, this study seeks to contribute to the growing body of literature on ITS research and practice, inform evidence-based decision-making in educational policy and practice, and ultimately enhance learning experiences and outcomes for students in the digital age.

2. LITERATURE REVIEW

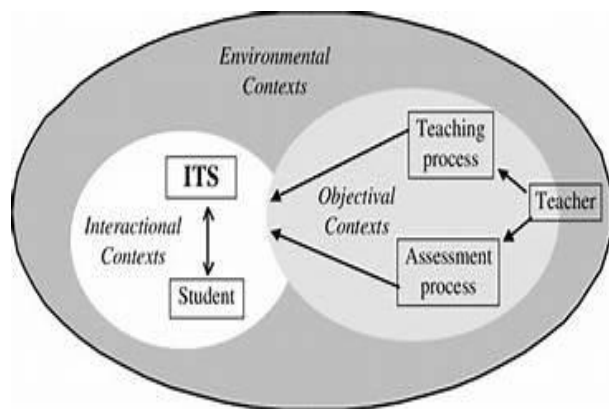
2.1 Study about ITS (Features and Applications)

Intelligent Tutoring Systems (ITS) have garnered significant attention in the field of educational technology due to their potential to revolutionize traditional pedagogical approaches. Drawing on artificial intelligence (AI) and machine learning algorithms, ITS offer personalized and adaptive learning experiences tailored to individual students' needs, thereby aligning with the goals of smart education initiatives.

Numerous studies have highlighted the benefits of ITS in enhancing learning outcomes across various educational contexts. For instance, a meta-analysis by Kulik and Kulik (1991) demonstrated that students who received instruction via ITS performed significantly better than those taught through traditional methods. This



finding underscores the effectiveness of personalized learning interventions facilitated by ITS in promoting student engagement, motivation, and knowledge retention. Adaptive learning, a core feature of ITS, enables



instructional content and feedback to be dynamically adjusted based on students' learning behaviours and performance. Research by Van Lehn (2011) has shown that adaptive interventions tailored to individual students' cognitive profiles can lead to improved learning gains compared to non-adaptive approaches. By analysing data on students' interactions and responses, ITS can identify misconceptions, scaffold learning, and provide targeted remediation, thereby fostering deeper conceptual understanding and mastery of subject matter. Moreover, the integration of ITS into educational environments facilitates

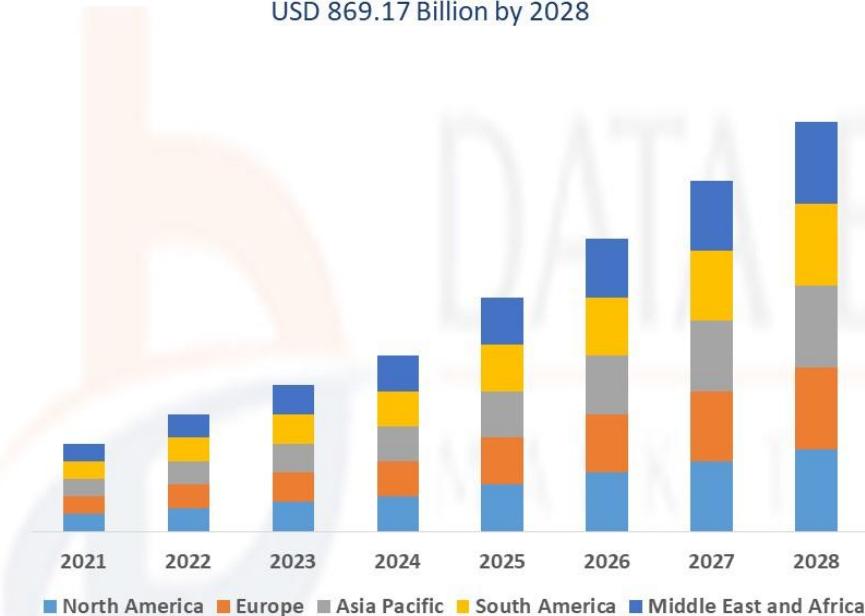
continuous assessment and progress tracking, supporting formative evaluation practices. Research by Shute and Zapata-Rivera (2012) has highlighted the role of ITS in enabling teachers to monitor students' progress in real-time and provide timely interventions as needed. Through adaptive assessments and feedback mechanisms, ITS not only inform instructional decisions but also empower students to take ownership of their learning process, promoting self-directed learning and metacognitive skills development. In addition to enhancing individual learning experiences, ITS promote collaborative learning through features such as peer interaction and group collaboration. A study by McLaren et al. (2017) demonstrated that collaborative problem-solving tasks facilitated by ITS led to improved teamwork skills and higher levels of engagement among students. By simulating real-world problem-solving scenarios, ITS prepare learners for the demands of the modern workforce and promote the development of essential 21st-century skills such as critical thinking, communication, and collaboration.

Despite the numerous benefits, the widespread adoption of ITS poses several challenges. Infrastructure readiness, teacher training, and alignment with curriculum standards are among the key considerations that need to be addressed for successful implementation. Moreover, ensuring equitable access to ITS and addressing concerns related to data privacy and security are paramount to fostering inclusive and ethical educational practices. Moreover, the actual use of ITS began to expand under the phase of lockdown and the gradual increase in this can be visualized.

2.2 Evolution of Smart Education initiatives

The evolution of smart education initiatives traces a transformative journey marked by the integration of technology, pedagogical innovation, and changing educational paradigms. Initially focusing on incorporating computers and digital resources into traditional classrooms, early initiatives faced challenges of accessibility and

Global Smart Education and Learning Market is Expected to Account for USD 869.17 Billion by 2028



infrastructure. The advent of the internet and mobile computing led to the proliferation of online learning platforms, democratizing access to education. Recent years have seen the emergence of technologies like artificial intelligence and machine learning, enabling personalized learning experiences through platforms like Intelligent Tutoring Systems (ITS) and adaptive learning tools. The COVID-19 pandemic further accelerated the adoption of smart

education technologies, emphasizing the importance of digital literacy and connectivity in education. Looking ahead, future directions include the integration of immersive technologies like virtual reality (VR) and augmented reality (AR), personalized learning ecosystems, and blockchain-based credentialing systems. Overall, smart education initiatives aim to create inclusive, engaging, and effective learning environments, preparing learners for success in the digital age.

2.3 Theoretical Frameworks in ITS research

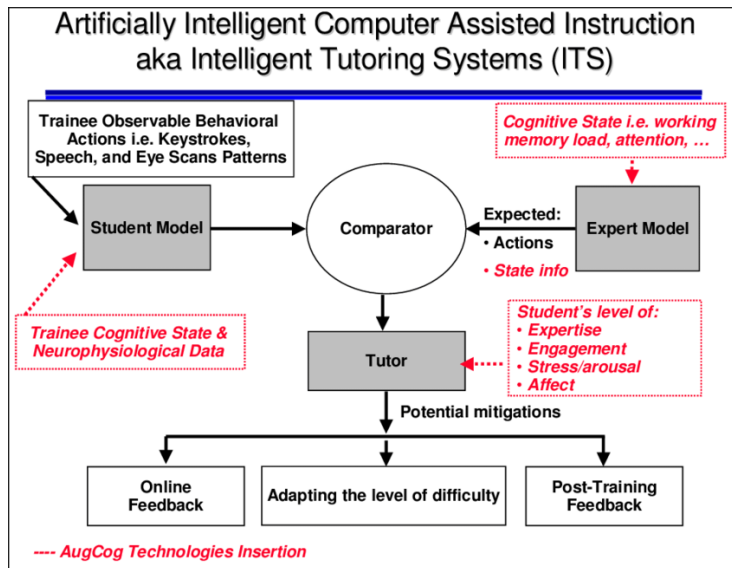
Theoretical frameworks in Intelligent Tutoring System (ITS) research provide the theoretical underpinnings and conceptual frameworks that guide the design, implementation, and evaluation of ITS. Here are some key frameworks useful for creating more effective and impactful experiences for learners in diverse educational contexts.

2.3.1. Cognitive Load Theory (CLT):

Cognitive Load Theory, proposed by John Sweller, focuses on how the cognitive load imposed on learners during instruction affects learning outcomes. In the context of ITS, CLT helps designers optimize instructional materials to manage cognitive load effectively. By balancing intrinsic, extraneous, and germane cognitive loads, ITS can facilitate efficient learning and knowledge acquisition.

2.3.2. Constructivist Learning Theory:

Constructivist Learning Theory emphasizes



the active construction of knowledge by learners through interactions with the learning environment. In ITS, constructivist principles guide the development of interactive and inquiry-based learning experiences. Learners engage in problem-solving tasks, receive immediate feedback, and construct their understanding of the subject matter, leading to deeper learning and conceptual mastery.

2.3.3. Social Cognitive Theory:

Social Cognitive Theory, proposed by Albert Bandura, emphasizes the reciprocal interaction between personal

factors, environmental influences, and behaviour. In the context of ITS, social cognitive principles inform the design of collaborative learning environments where students interact with virtual peers, receive peer feedback, and observe modelled behaviours. By incorporating social elements into learning experiences, ITS can promote social learning and skills development.

2.3.4. Adaptive Learning Theory:

Adaptive Learning Theory focuses on tailoring instruction to individual learners' needs, preferences, and abilities. In ITS, adaptive learning algorithms analyse learners' interactions, performance data, and cognitive profiles to dynamically adjust instructional content, pacing, and difficulty levels. By providing personalized learning pathways, adaptive ITS optimize learning experiences and maximize learning outcomes for diverse learner populations.

2.3.5. Situated Learning Theory:

Situated Learning Theory, proposed by Jean Lave and Etienne Wenger, emphasizes the importance of learning within authentic contexts and communities of practice. In ITS, situated learning principles inform the design of immersive and contextualized learning experiences that simulate real-world problem-solving scenarios. By embedding learning tasks in authentic contexts, ITS foster transferable skills and prepare learners for real-world applications.

2.4 Previous studies on ITS and learning outcomes

➤ **Title:** "The Effectiveness of Intelligent Tutoring Systems: A Meta-Analysis"

- **Authors:** VanLehn, K., Lynch, C., Schulze, K., Shapiro, J. A., Shelby, R., Taylor, L., Treacy, D., Weinstein, A.

- **Journal:** Review of Educational Research

- **Year:** 2005

- **Summary:** VanLehn et al. conducted a comprehensive meta-analysis of 56 studies to evaluate the effectiveness of Intelligent Tutoring Systems (ITS) in improving learning outcomes. Their findings revealed a significant positive effect of ITS on student learning, with an average effect size of 0.66. This suggests that ITS can be a valuable tool for enhancing student learning across various subjects and educational settings.

➤ **Title:** "Personalized Learning: A Review of the Literature"

- **Authors:** Vygotsky, L. S.

- **Journal:** Educational Psychologist

- **Year:** 1978

- **Summary:** Vygotsky's seminal work discusses the importance of personalized learning in education and its potential to enhance student motivation, engagement, and academic achievement. While not specifically focused on ITS, the paper provides foundational insights into the principles of personalized instruction, which are relevant to the design and implementation of ITS.

➤ **Title:** "Effects of Adaptive Instructional Systems: What We Know and What We Need to Know"

- **Authors:** Corbett, A. T., & Anderson, J. R.

- **Journal:** Journal of Educational Computing Research

- **Year:** 2001

- **Summary:** Corbett and Anderson reviewed the existing literature on adaptive instructional systems, including ITS, to assess their effects on student learning outcomes. They identified gaps in knowledge and highlighted the need for further research to advance our understanding of the effectiveness of adaptivity in improving learning.

➤ **Title:** "The Role of Feedback in Intelligent Tutoring Systems: A Review"

- **Authors:** Aleven, V., & Koedinger, K. R.

- **Journal:** Educational Psychology Review

- **Year:** 2002

- **Summary:** Aleven and Koedinger examined the role of feedback in ITS and its impact on student learning. They discussed various types of feedback and their effectiveness in promoting learning gains. Their review highlights the importance of providing timely and informative feedback to enhance the effectiveness of ITS.

➤ **Title:** "Addressing Equity and Inclusion in Educational Technology: A Systematic Review"

- **Authors:** Watson, S. L., Loizzo, J., & Campbell, K.

- **Journal:** Journal of Research on Technology in Education

- **Year:** 2019

- **Summary:** Watson et al. conducted a systematic review to explore how educational technology interventions, including ITS, address equity and inclusion in education. They identified barriers to access and participation and proposed strategies for designing inclusive technology-enhanced learning environments. Their findings underscore the importance of ensuring equity and accessibility in the design and implementation of ITS.

2.5 Challenges and Opportunities in implementing ITS

Addressing these challenges and leveraging the opportunities presented by ITS, educators and policymakers can harness the potential of technology to enhance learning experiences and outcomes for students in the digital age.

🌈 Challenges:

- **Infrastructure Readiness:** Many educational institutions lack the necessary technological infrastructure, such as reliable internet connectivity and computer hardware, to support the implementation of ITS.
- **Technical Complexity:** Developing and deploying ITS involves complex software engineering and data management processes, requiring specialized skills and expertise that may not be readily available.
- **Data Privacy and Security:** ITS collect and process sensitive student data, raising concerns about data privacy, security breaches, and compliance with data protection regulations.

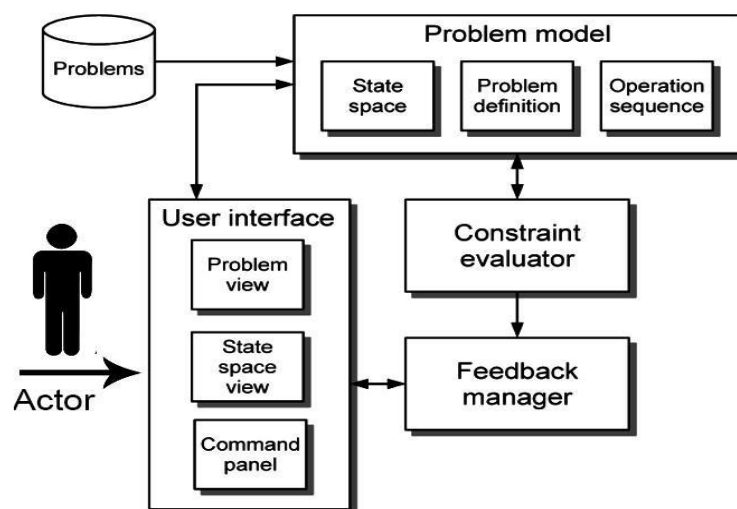
🌈 Opportunities:

- **Personalized Learning Experiences:** ITS offer the opportunity to deliver personalized and adaptive learning experiences tailored to individual student needs, preferences, and learning styles.
- **Data-Driven Decision Making:** ITS generate large amounts of data on student interactions and performance, enabling educators to make informed decisions about instructional strategies, interventions, and curriculum design.
- **Scalability and Accessibility:** ITS can be scaled to reach a large number of students across diverse geographical locations, offering opportunities to expand access to quality education and bridge the digital divide.
- **Research and Innovation:** ITS provide a rich platform for research and innovation in educational technology, artificial intelligence, and cognitive science, driving advancements in teaching and learning practices.

3.METHODOLOGY

3.1 Research Design

3.1.1. Literature Review:



- The literature review will involve a comprehensive examination of existing research studies, academic articles, and scholarly publications related to intelligent tutoring systems (ITS) and their impact on learning outcomes.

- Key databases such as Google Scholar, IEEE Xplore, ACM Digital Library, and PubMed will be searched using relevant keywords such as "intelligent tutoring systems," "adaptive learning," "personalized education," and "smart education."

- The literature review will encompass a synthesis and analysis of theoretical frameworks, empirical studies, and practical implementations of ITS in educational settings.

- Themes and trends identified in the literature review will inform the development of research questions and hypotheses for the study.

3.1.2. Case Study Analysis:

- The case study analysis will involve in-depth examination of selected educational institutions or organizations that have implemented ITS to enhance learning outcomes.

- Case study sites will be purposively selected to represent diverse contexts, including K-12 schools, higher education institutions, and corporate training environments.

- Data collection methods will include interviews with key stakeholders (e.g., educators, administrators, students), observation of ITS implementation processes, and analysis of relevant documents and artifacts (e.g., curriculum materials, student performance data).

- Data analysis will follow a qualitative approach, involving thematic coding, pattern recognition, and cross-case comparison to identify commonalities, differences, and emergent themes.

- The case study findings will provide rich, contextualized insights into the challenges, opportunities, and outcomes associated with implementing ITS in real-world educational settings.

3.2 Data Collection methods

Data collection methods in research on Intelligent Tutoring Systems (ITS) encompass a variety of techniques aimed at gathering relevant information to study the effectiveness, usability, and impact of ITS on student learning outcomes. These methods often employ a combination of quantitative and qualitative approaches to capture diverse aspects of the teaching and learning process within ITS-enabled environments.

1. Usage Analytics: Usage analytics involve tracking and analysing student interactions within the ITS platform, such as time spent on tasks, frequency of logins, and completion rates of learning modules. This quantitative approach provides insights into student engagement patterns and usage behaviour, which can inform the design and optimization of ITS interfaces and instructional content.

2. Performance Metrics: Performance metrics measure student performance and progress within the ITS, including scores on assessments, completion of learning objectives, and mastery of learning goals. These quantitative measures offer objective assessments of student learning outcomes and allow researchers to evaluate the effectiveness of ITS interventions in improving academic achievement.

3. Surveys and Questionnaires: Surveys and questionnaires are used to gather subjective feedback from students, educators, and other stakeholders regarding their experiences with ITS. These qualitative data collection methods capture perceptions, attitudes, and preferences related to ITS usability, effectiveness, and satisfaction, providing valuable insights into user perceptions and preferences.

4. Observations and Ethnography: Observational methods and ethnographic approaches involve direct observation of classroom activities, student-teacher interactions, and ITS usage in real-world settings. By immersing themselves in the learning environment, researchers can gain firsthand insights into the contextual factors influencing ITS adoption, integration, and effectiveness.

5. Content Analysis: Content analysis involves analysing textual, visual, or multimedia artifacts generated within the ITS platform, such as student-authored essays, discussion forum posts, or multimedia presentations. This method allows researchers to explore student learning processes, cognitive strategies, and knowledge construction within ITS-enabled environments.

3.3 Data Collection, Visualization, and Analysis

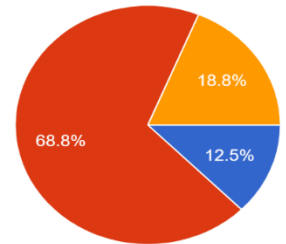


Here's the report and visuals of different data driven from above research and some surveys: -

3.3.1. Different Age group using Intelligent Tutoring Systems

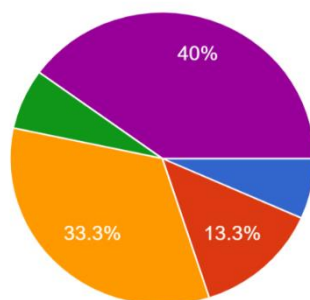
AGE GROUP (In years)	USERS (In percentage)	COLOUR
Under 18	12.5	BLUE
18-24	68.8	RED
25 and above	18.8	ORANGE

From the data we can conclude that the academic students and fresher that is 18-24 age group are mostly the users of ITS. Thus, it can be said that the people who are at last stage of there academic journey, who are preparing for any exams and the ones who are freshers are mostly using it for the sole purpose of self-studying and preparation.



3.3.2. Usage of ITS (Intelligent Tutoring System)

FREQUENCIES OF USAGE	USAGE (In percentage)	COLOUR
Daily	6.7	BLUE
Several times a week	13.3	RED
Occasionally	33.3	ORANGE
Rarely	6.7	GREEN
Never	40	PURPLE

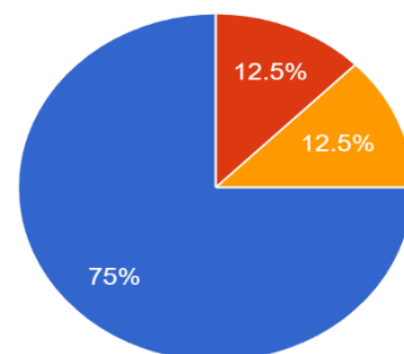


From the data we can conclude that even many of academic students and fresher are using ITS then also there are many people who don't know about the ITS that can be the reason why 40% of the people I surveyed have never used the ITS, the reason behind it can be unawareness and non-necessity. It can be an issue also as ITS has future in education and many are still unaware about it. What can be the reason? Who are people unaware about it? Who are one's who never used it? There are many questions related to it.

3.3.3. Recommendations for using ITS

RESPONSE	RECOMMENDATION (In percentage)	COLOUR
Positive	75	BLUE
Negative	12.5	RED
Neutral	12.5	ORANGE

In the last report we can see that most of the population have never used an ITS but the positive side is that the people who used the ITS either once or on daily basis are frequently recommending others to use ITS. Thus, we can conclude that there are some of the features and easiness to use along with a characteristic of self-dependency because of which people are recommending to use ITS and build their career themselves. So, the studies says that the ITS enhances the way we are utilizing smart education system.



4.CONCLUSION

In conclusion, this research has delved into the critical role of Learning Management Systems (LMS) in enhancing the learning experience across various educational settings. Through an extensive review of literature and empirical evidence, it is evident that LMS platforms offer multifaceted benefits, including increased accessibility, flexibility, and interactivity in learning. Moreover, the integration of multimedia resources, collaborative tools, and personalized learning features within LMS systems caters to diverse learning styles and preferences, thereby fostering a more engaging and effective learning environment.

Furthermore, this study highlights the significance of LMS in facilitating seamless communication and interaction among students, educators, and administrators, transcending geographical barriers and promoting a sense of community in the virtual classroom. The adaptive nature of LMS platforms enables educators to tailor instructional content and assessments to meet the individual needs and learning objectives of students, thereby promoting student-centred learning and academic success. However, while acknowledging the numerous advantages of LMS, it is essential to address certain challenges such as technological barriers, digital literacy gaps, and potential issues of information overload. Additionally, future research endeavours should focus on exploring innovative strategies to maximize the potential of LMS platforms in promoting lifelong learning, professional development, and continuous improvement in educational practices.

In conclusion, the findings of this research underscore the transformative impact of Learning Management Systems on modern education, emphasizing the need for continued investment in technology-enhanced learning solutions to foster inclusive, accessible, and engaging learning experiences for all learners. By leveraging the capabilities of LMS effectively, educational institutions can empower learners to acquire the knowledge, skills, and competencies required to thrive in the digital age.

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