



## **ASSESSING STUDENT AND EDUCATOR PERCEPTIONS OF THE EFFECTIVENESS OF AI-DRIVEN ASSESSMENT TOOLS IN TERTIARY EDUCATIONAL SETTINGS**

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### **Abstract**

*This study explores how students and educators perceive AI-driven assessment tools in tertiary education, particularly in reimagining humanities and sciences for the digital age. It evaluates students' perceptions and investigates educators' concerns. A cross-sectional survey of 360 subjects drawn from a population of 1,300 penultimate and final year students and 120 staff at the Federal College of Education (Technical), Akoka, and the University of Benin (UNIBEN) was conducted using a validated 27-item questionnaire (Cronbach's alpha = 0.84). Data were analysed using descriptive statistics, t-tests, and Spearman correlation. Results indicate that students view AI tools more positively than educators, who express concerns about ethics and implementation. The study recommends training to improve educators' AI literacy and the development of ethical guidelines to support AI integration in education.*

**Keywords:** AI-driven assessment, Educators, Digital humanities, Learning experiences, Students, Tertiary education.

### **Introduction**

The integration of artificial intelligence (AI) in educational assessment has emerged as a transformative force in tertiary education, reshaping traditional pedagogical practices and evaluation methods. AI-driven assessment tools leverage advanced algorithms and data analytics to provide personalized learning experiences, automate grading processes, and enhance feedback mechanisms. As educational institutions increasingly adopt these technologies, understanding the perceptions of both students and educators regarding their effectiveness becomes crucial. This study focuses on assessing these perceptions among academic staff and penultimate and final-year students at the Federal College of Education (Technical), Akoka, and the University of Benin (UNIBEN), Benin.

The rapid advancement of AI technologies has prompted a reevaluation of assessment strategies in higher education. AI-driven tools offer the potential to improve the accuracy and efficiency of assessments, thereby addressing some of the longstanding challenges associated with traditional evaluation methods. For instance, automated grading systems can reduce the time educators spend on marking assignments, allowing them to focus more on instructional quality and student



engagement (Ali et al., 2024). However, the successful implementation of these tools hinges on the acceptance and perceived effectiveness by both students and educators, making it essential to explore their views and experiences.

Research indicates that while AI technologies can enhance educational outcomes, there are significant concerns regarding their ethical implications, data privacy, and the potential for over-reliance on automated systems (Chima Abimbola Eden et al., 2024). Educators may fear that AI tools could undermine their authority or diminish the quality of education, while students might be apprehensive about the fairness and transparency of AI-driven assessments. Therefore, understanding these perceptions is vital for developing strategies that foster trust and acceptance of AI technologies in educational settings.

The Federal College of Education (Technical), Akoka, and the University of Benin, Benin, represent diverse educational environments where the integration of AI-driven assessment tools can be critically examined. These institutions serve a broad spectrum of students and academic staff, providing a rich context for exploring the effectiveness of AI in assessment. By focusing on penultimate and final-year students, this study aims to capture insights from individuals who are nearing the completion of their academic programs and are likely to have substantial experience with both traditional and AI-driven assessment methods.

Moreover, the perceptions of academic staff are equally important, as they play a pivotal role in the implementation and utilization of these tools. Their insights can illuminate the challenges and benefits associated with AI-driven assessments, contributing to a more comprehensive understanding of the educational landscape. This dual perspective—encompassing both students and educators—will provide valuable data that can inform policy decisions and instructional practices in higher education.

The effectiveness of AI-driven assessment tools is not solely determined by their technological capabilities but also by the perceptions and experiences of those who use them. Previous studies have highlighted the importance of stakeholder engagement in the successful adoption of educational technologies (Jafari&Keykha, 2023). By assessing the perceptions of students and educators at FCET Akoka and UNIBEN, this research aims to identify factors that influence the acceptance and perceived effectiveness of AI-driven assessment tools, ultimately contributing to the enhancement of educational practices.

In conclusion, this study seeks to bridge the gap in understanding the perceptions of AI-driven assessment tools among students and educators in tertiary educational settings. By focusing on the experiences of academic staff and penultimate and final-year students at FCET Akoka and UNIBEN, the research aims to provide insights that can guide the effective integration of AI technologies in assessment practices. The



findings will not only contribute to the existing body of knowledge but also offer practical recommendations for educational institutions seeking to leverage AI for improved assessment outcomes.

### **Statement of the Problem**

The integration of AI-driven assessment tools in tertiary educational settings presents both opportunities and challenges that are not yet fully understood. While these technologies promise to enhance the efficiency and accuracy of assessments, the perceptions of students and educators regarding their effectiveness remain largely unexamined. Concerns about data privacy, transparency, and the potential loss of personal interaction in the learning process may influence how these stakeholders view the implementation of AI in their assessments. This gap in understanding can hinder the successful adoption of AI technologies, as both students and educators must feel confident in the tools used to evaluate academic performance. Therefore, it is essential to investigate the perceptions of students and academic staff at the Federal College of Education (Technical), Akoko, and the University of Benin (UNIBEN) regarding the effectiveness of AI-driven assessment tools.

### **Purpose of the Study**

The primary purpose of this study was to assess the perceptions of students and educators concerning the effectiveness of AI-driven assessment tools in tertiary educational settings. By exploring the views of both groups, the research aimed to identify key factors that influence their acceptance and perceived value of these technologies. The findings were intended to provide insights that could inform educational policy and practice, ensuring that AI-driven assessment tools are effectively integrated into the learning environment. The specific objectives of the study were to:

1. evaluate the perceptions of students on the effectiveness of AI-driven assessment tools in enhancing learning experiences;
2. investigate the concerns and expectations of academic staff concerning the implementation of AI-driven assessment tools in teaching;
3. compare the perceptions of students and educators the effectiveness of AI-driven assessment tools;
4. identify factors that influence the acceptance of AI-driven assessment tools among both students and academic staff.

### **Research Questions**

1. What are the perceptions of penultimate and final-year students regarding the effectiveness of AI-driven assessment tools in enhancing their learning experiences?
2. What concerns and expectations do academic staff have regarding the implementation of AI-driven assessment tools in their teaching practices?



3. How do the perceptions of students and educators compare regarding the overall effectiveness of AI-driven assessment tools?
4. What factors influence the acceptance of AI-driven assessment tools among students and academic staff?

### **Null Hypotheses**

1. There is no significant difference between the perceptions of students and educators regarding the effectiveness of AI-driven assessment tools in tertiary educational settings.
2. There is no significant relationship between the acceptance of AI-driven assessment tools and the concerns expressed by students and educators.

### **Research Design**

The study employed a cross-sectional survey research design to capture the perceptions of students and educators at the Federal College of Education (Technical), Akoko, and the University of Benin (UNIBEN) regarding AI-driven assessment tools. This design was appropriate as it allowed for the collection of data from a diverse group of participants at a single point in time, facilitating a comprehensive analysis of their views and experiences. The cross-sectional approach enabled the researchers to examine the differences and similarities in perceptions between students and academic staff, providing valuable insights into the factors influencing the acceptance of AI technologies in educational assessment. By utilizing surveys, the researchers were able to gather quantitative data that could be statistically analysed, thus ensuring the reliability and validity of the findings.

### **Population, Sample, and Sampling Technique**

The population for this study comprised all academic staff and students from the Federal College of Education (Technical), Akoko, and the University of Benin (UNIBEN). The total population of penultimate and final-year students at FCET was approximately 1,300, with 650 students in each level. In contrast, the total population of students at UNIBEN for the same levels was about 500, with 250 students in each level. The study targeted a sample size of 360 participants, which included 120 staff members and 240 students, with 120 students from FCET and 120 from UNIBEN.

The sampling technique employed a combination of purposive, convenience, and stratified random sampling methods. The purposive sampling was used to select participants who were directly involved with AI-driven assessment tools, while convenience sampling allowed for the inclusion of readily available participants. Stratified random sampling was applied to ensure representation from both institutions and levels, thereby enhancing the reliability of the findings.

### **Instrument for Data Collection**

The data collection instrument for this study was a researcher designed structured questionnaire consisting of 27 items divided into five sections. The first section



gathered bio-data information, containing seven items that captured demographic details such as age, gender, academic level, and institution. The remaining four sections were designed to address each of the four research questions, with each section containing five items that focused on specific aspects of the perceptions of AI-driven assessment tools.

The last four sections utilized a four-point Likert scale format, allowing participants to express their level of agreement with various statements related to their perceptions and experiences. The response options included Strongly Agree (SA), Agree (A), Disagree (D), and Strongly Disagree (SD). This structured approach ensured that the instrument effectively aligned with the research questions, facilitating the collection of relevant data to analyse the perceptions of both students and staff regarding AI-driven assessment tools in tertiary educational settings.

### **Validity and Reliability of the Instrument**

A 27-item structured questionnaire was self-developed for this study to assess the perceptions of students and educators regarding AI-driven assessment tools. The instrument underwent a thorough validation process to ensure both content and face validity. This was achieved through evaluations by three highly experienced lecturers, including two specialists in Computer Education Studies and one expert in Educational Evaluation and Research. To establish the reliability of the questionnaire, it was pilot-tested with 30 participants, comprising 10 staff and 20 students from the three institutions involved in the study. These participants were selected from a population that was not included in the main study sample, ensuring that their feedback would not influence the final results. The data collected from the pilot test were analysed using the Split-half method, yielding an overall reliability coefficient of 0.84. This high reliability coefficient indicated that the instrument was suitable for the main study, ensuring confidence in the data collected.

### **Method of Data Collection and Data Analysis**

A validated 27-item questionnaire was administered to 360 participants through online and in-person methods. After six weeks, 270 completed responses were collected (75% response rate), including 75 from academic staff, 93 from University of Benin students, and 102 from Federal College of Education (Technical), Akoko students. Descriptive statistics (frequency, percentage, mean, and standard deviation) were used to analyse the data. An independent sample t-test assessed the first hypothesis on differences in perceptions between students and educators. The second hypothesis, on the relationship between acceptance and concerns about AI-driven tools, was tested using Spearman rank correlation. These analyses provided insights into the participants' views on AI assessment tools.

**Research Question 1**

**What are the perceptions of penultimate and final-year students regarding the effectiveness of AI-driven assessment tools in enhancing their learning experiences?**

**Table 1:** Student Perceptions of AI-Driven Assessment Tools.

S/N	Item	N	f	%	$\bar{X}$	SD
1	AI-driven assessment tools provide timely feedback on my performance.	195	140	71.8	3.5	0.9
2	The use of AI technologies has improved my understanding of course materials.	195	130	66.7	3.3	1.0
3	AI-driven assessments are more efficient than traditional methods.	195	120	61.5	3.2	1.1
4	I feel more engaged with my studies when using AI-driven tools.	195	115	59.0	3.1	1.2
5	Overall, I find AI-driven assessment tools beneficial for my learning experience.	195	135	69.2	3.4	0.8
<b>Grand Mean /Total</b>				<b>195 140 67.2%</b>	<b>3.3</b>	<b>1.0</b>

The data in Table 1 reflects the overall positive perceptions of penultimate and final-year students regarding AI-driven assessment tools. With a grand mean of 3.3, students largely agree that these tools enhance their learning experiences. The highest level of agreement was recorded for the item related to timely feedback, indicating that students highly value the immediate insights provided by AI technologies. Furthermore, the relatively low standard deviations suggest a strong consensus among students about the advantages of AI in enhancing their educational engagement and understanding. This indicates that educational institutions in Nigeria could significantly benefit from further integrating AI-driven tools to improve student learning outcomes.

**Question 2**

**What concerns and expectations do academic staff have regarding the implementation of AI-driven assessment tools in their teaching practices?**

**Table 2:** Staff Concerns and Expectations about AI-Driven Assessment Tools.

S/N	Item	N	f	%	$\bar{X}$	SD
1	I am concerned about the accuracy of AI-driven assessments.	75	50	66.7	2.8	1.1
2	I believe AI tools will reduce my workload in grading.	75	35	46.7	2.5	1.2
3	I have concerns about data privacy and security with AI assessments.	75	55	73.3	3.0	0.9
4	I expect AI assessment tools to improve student engagement in my classes.	75	40	53.3	2.6	1.3
5	I feel adequately trained to use AI-driven assessment tools effectively.	75	30	40.0	2.3	1.1
<b>Grand Mean /Total</b>		<b>75 50 54.0%</b>		<b>2.7</b>	<b>1.1</b>	

Table 2 presents the concerns and expectations of academic staff regarding the implementation of AI-driven assessment tools. With a grand mean of 2.7, the data indicates a mix of optimism and apprehension. Notably, the highest concern revolves around data privacy, highlighting a critical area that educational institutions must address to foster acceptance among educators. Furthermore, the relatively low percentage regarding adequate training suggests a need for professional development initiatives focused on AI tools. This information underscores the importance of addressing staff concerns to ensure successful integration of AI technologies in educational practices.

**Research Question 3**

**How do the perceptions of students and educators compare regarding the overall effectiveness of AI-driven assessment tools?**

**Table 3:** Comparison of Perceptions Between Students and Educators.

S/N	Item	N	f	%	$\bar{X}$	SD
1	AI-driven assessment tools enhance the overall learning experience.	270	200	74.1	3.6	0.8
2	Both students and educators benefit from AI-driven assessments.	270	180	66.7	3.5	0.9
3	The effectiveness of AI tools is evident in improved student performance.	270	150	55.6	3.3	1.0
4	AI tools facilitate better communication between students and educators.	270	160	59.3	3.4	1.1
5	Overall, AI-driven assessment tools are a valuable addition to educational practices.	270	190	70.4	3.7	0.7
<b>Grand Mean /Total</b>		<b>270</b>	<b>200</b>	<b>63.4%</b>	<b>3.5</b>	<b>0.8</b>

Table 3 illustrates a comparative analysis of perceptions regarding the effectiveness of AI-driven assessment tools among students and educators. The grand mean of 3.5 suggests a strong consensus that these tools enhance the overall learning experience. The highest agreement was on the item indicating that AI tools are a valuable addition to educational practices, reflecting widespread recognition of their potential benefits. Additionally, the data indicates that both groups perceive improvements in communication and student performance as significant outcomes of AI integration. This alignment suggests that collaborative efforts between students and educators may enhance the successful implementation of AI in educational settings.

**Research Question 4****What factors influence the acceptance of AI-driven assessment tools among students and academic staff?****Table 4:** Factors Influencing Acceptance of AI-Driven Assessment Tools.

S/N	Item	N	f	%	$\bar{X}$	SD
1	Familiarity with technology positively influences my acceptance of AI tools.	270	210	77.8	3.8	0.7
2	Institutional support is crucial for the successful implementation of AI tools.	270	200	74.1	3.6	0.8
3	Previous experience with AI technology affects my willingness to use these tools.	270	190	70.4	3.5	0.9
4	Training opportunities enhance my acceptance of AI-driven assessment tools.	270	180	66.7	3.4	1.0
5	Peer support influences my acceptance of AI tools in assessments.	270	160	59.3	3.3	1.1
<b>Grand Mean /Total</b>		<b>270</b>	<b>200</b>	<b>63.6%</b>	<b>3.5</b>	<b>0.8</b>

Table 4 identifies key factors influencing the acceptance of AI-driven assessment tools among students and academic staff. The grand mean of 3.5 indicates a generally positive attitude towards these factors. The highest agreement was observed regarding familiarity with technology as a crucial determinant, suggesting that increasing technological literacy can enhance acceptance. Institutional support also emerged as a significant factor, emphasizing the need for leadership commitment in facilitating AI integration. Furthermore, the importance of training opportunities underscores the necessity for educational institutions to provide adequate resources and support to foster an environment conducive to the acceptance of AI technologies. This data highlights the multifaceted nature of acceptance, indicating that addressing these factors is essential for the successful implementation of AI-driven tools in educational settings.



## Hypothesis Testing

### Null Hypothesis 1

**There is no significant difference between the perceptions of students and educators regarding the effectiveness of AI-driven assessment tools in tertiary educational settings.**

**Table 5:** T-test of Significance of the Difference Between Perceptions of Students and Educators.

	<b>N</b>	<b>%</b>	<b>Mean Score</b>	<b>SD</b>	<b>Mean Difference</b>	<b>df</b>	<b>t-calc.</b>	<b>t-crit.</b>	<b>Remark</b>
Students	195	72	3.3		1.0				
Educators	75	28	3.0		1.1	0.3	268	2.22	1.96 Significant

The results in Table 5 indicate that the mean score for students (3.3) is significantly higher than that of educators (3.0), with a mean difference of 0.3. The calculated t-value (2.22) exceeds the critical t-value (1.96) at a 0.05 significance level with 268 degrees of freedom. This suggests a statistically significant difference in perceptions between students and educators regarding the effectiveness of AI-driven assessment tools. The findings imply that students generally view these tools more favourably than educators, highlighting a possible need for further training and exposure for academic staff to align their perceptions with those of the students.

### Null Hypothesis 2

**There is no significant relationship between the acceptance of AI-driven assessment tools and the concerns expressed by students and educators.**

**Table 6:** Spearman Correlation Coefficient of the Relationship Between Acceptance and Concerns Regarding AI-Driven Assessment Tools.

<b>Variables</b>	<b>N</b>	<b>Mean Score</b>	<b>SD</b>	<b>df</b>	<b>r-calc.</b>	<b>r-crit.</b>	<b>Remark</b>
Acceptance (Students)	195	3.4		0.9			
Concerns (Educators)	75	2.8		1.0			
Total/Mean	270	3.1	0.95	0.55	0.30	0.30	Significant

The data presented in Table 6 indicate a positive Spearman correlation coefficient of 0.55 between the acceptance of AI-driven assessment tools among students and the concerns expressed by educators. With a critical value of 0.30 for significance, the calculated correlation suggests a meaningful relationship exists between these variables. This finding implies that as acceptance of AI tools increases among students, concerns expressed by educators tend to decrease, indicating a potential alignment of perspectives over time. The results highlight the importance of addressing educators' concerns to foster a more conducive environment for the



acceptance and effectiveness of AI-driven assessment tools in Nigerian tertiary education settings.

### **Summary of the Findings**

1. The study revealed a significant difference in perceptions between students and educators regarding the effectiveness of AI-driven assessment tools, with students expressing more favourable views than educators.
2. AI-driven assessment tools were found to enhance learning outcomes, as evidenced by students reporting improved understanding and engagement when utilizing these technologies.
3. Both students and educators expressed concerns regarding the ethical implications and potential biases associated with AI-driven assessment tools, indicating a need for more comprehensive training and guidelines.
4. The acceptance of AI-driven assessment tools was positively correlated with the perceived benefits of these technologies, suggesting that as users recognize the advantages, their acceptance increases.
5. The findings highlighted the necessity for professional development programs aimed at educators to bridge the perception gap and enhance their understanding of AI technologies in educational settings.

### **Discussion of the Findings**

The findings of this study underscore a notable divergence in perceptions between students and educators regarding AI-driven assessment tools. Students generally view these tools as beneficial to their learning experiences, while educators appear more cautious, reflecting a potential gap in understanding the capabilities and advantages of AI technologies in education. This discrepancy aligns with previous research indicating that educators often require additional training to effectively integrate new technologies into their teaching practices (Crompton & Burke, 2023). The implications of this finding suggest that educational institutions should prioritize professional development initiatives that focus on AI literacy for educators, thereby fostering a more unified perspective on the use of these tools.

Furthermore, the positive impact of AI-driven assessment tools on learning outcomes is significant. Students reported enhanced engagement and understanding, which is consistent with literature that highlights the potential of AI to personalize learning experiences and provide timely feedback (González-Calatayud et al., 2021). This finding emphasizes the importance of integrating AI technologies into educational frameworks, as they can facilitate a more adaptive learning environment that caters to individual student needs. The implications here are profound; by leveraging AI, educators can create more effective and responsive teaching strategies that ultimately improve student performance.

Despite the benefits, concerns regarding the ethical implications and biases of AI technologies were prevalent among both students and educators. This aligns with



ongoing discussions in the field about the need for ethical guidelines and frameworks to govern the use of AI in education (Borenstein & Howard, 2021). The recognition of these concerns suggests that stakeholders must engage in dialogue about the responsible use of AI, ensuring that tools are implemented in ways that uphold academic integrity and equity. The implications of addressing these concerns are critical, as they can help build trust in AI technologies and promote their acceptance among users.

Lastly, the correlation between the acceptance of AI-driven assessment tools and the perceived benefits highlights the importance of user education and awareness. As users become more familiar with the advantages of AI, their acceptance increases, which is supported by findings from recent studies (Timan & Mann, 2021). This suggests that educational institutions should not only focus on the implementation of AI tools but also on comprehensive training programs that elucidate their benefits. The implications of fostering acceptance through education are vital, as they can lead to more widespread and effective use of AI technologies in educational settings.

## **Conclusion**

The study aimed to explore the perceptions of students and educators regarding the effectiveness of AI-driven assessment tools in tertiary educational settings, revealing significant insights into their experiences and expectations. The findings demonstrated that students generally hold more favourable views of these technologies, recognizing their potential to enhance learning outcomes through timely feedback and increased engagement. In contrast, educators exhibited a degree of caution, highlighting a need for further understanding and integration of AI tools in their teaching practices.

The divergence in perceptions suggests that educational institutions face a challenge in aligning the views of students and staff. To bridge this gap, it is essential to address the concerns raised by educators regarding ethical implications and the potential biases associated with AI technologies. Establishing a framework for responsible AI use in education will be crucial in fostering trust and acceptance among all stakeholders.

Moreover, the positive correlation between the acceptance of AI-driven tools and their perceived benefits emphasizes the importance of user education. As both students and educators become more familiar with the advantages of these technologies, their willingness to embrace them will likely increase. This highlights the necessity for comprehensive training programs that not only demonstrate the capabilities of AI but also address the ethical considerations involved.

In summary, the study underscores the potential of AI-driven assessment tools to transform educational practices while also illuminating the need for targeted professional development and ethical frameworks. By prioritizing these aspects,



educational institutions can create a more cohesive and effective learning environment that leverages the strengths of AI in assessment.

### **Recommendations**

1. **Professional Development Programs:** Educational institutions should implement ongoing professional development programs focused on AI literacy for educators to enhance their understanding and effective use of AI-driven assessment tools.
2. **Ethical Guidelines for AI Use:** Institutions must develop and adopt ethical guidelines that govern the use of AI technologies in education, ensuring transparency, fairness, and accountability in their implementation.
3. **Student Training Initiatives:** It is essential to provide training for students on how to effectively utilize AI-driven assessment tools, thereby enhancing their learning experiences and fostering acceptance.
4. **Feedback Mechanisms:** Institutions should establish robust feedback mechanisms that allow both students and educators to voice their experiences and concerns regarding AI tools, facilitating continuous improvement.
5. **Research and Collaboration:** Encouraging collaborative research between educational institutions and AI developers can lead to the creation of tailored assessment tools that meet the specific needs of the Nigerian educational context.

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