

Integration of Deep Learning Concepts and Modern Education Evaluation: A Comparative Study of Indonesia and Singapore

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ABSTRACT

This study aims to analyze the integration of deep learning concepts in modern education evaluation systems through a comparative study between Indonesia and Singapore. The study is grounded in the assumption that the level of deep learning integration in educational evaluation is influenced by policy readiness, technological infrastructure, and human resource competence. A qualitative comparative approach was employed by analyzing policy documents, international reports, and relevant scientific literature. The findings indicate that Singapore has systematically implemented deep learning to support adaptive and process-oriented learning evaluation. In contrast, Indonesia's evaluation system remains largely focused on learning outcomes with limited technological integration. These results reveal a structural gap in the implementation of modern educational evaluation and highlight the need to reformulate Indonesia's evaluation policies toward a more data-driven and learning-oriented approach

INTRODUCTION

The rapid development of digital technology has brought fundamental changes to educational practices, including learning evaluation systems. Educational evaluation, which previously focused primarily on measuring final outcomes through standardized testing, has gradually shifted toward more comprehensive, continuous, and process-oriented approaches that emphasize students' learning trajectories. This shift aligns with the demands of 21st-century education, which highlight the use of learning data as a basis for more accurate and context-sensitive educational decision-making (OECD, 2021).

One technological advancement with strong potential to address these demands is deep learning. As a branch of artificial intelligence, deep learning is capable of processing large and complex datasets to identify patterns and non-linear relationships. In educational contexts, deep learning is not only used to support digital learning environments but has also begun to play a role in evaluation systems by analyzing students' learning behaviors, identifying learning difficulties, and providing more adaptive and personalized feedback (Holmes et al., 2019; Williamson & Eynon, 2020). This approach reflects a shift in evaluation from a mere measurement tool toward an instrument for learning development.

In Indonesia, various policies promoting digital transformation in education have been introduced in recent years. However, the implementation of learning evaluation at the practical level remains largely dominated by outcome-based assessment and has not yet been fully integrated with artificial intelligence-based learning analytics. Evaluation is often positioned as the final stage of instruction rather than as a continuous process that supports the improvement of teaching and learning strategies (Suryani & Fatmawati, 2021; Kemendikbudristek, 2022). This condition indicates a gap between the direction of educational policy and evaluation practices at the institutional level.

In contrast, Singapore has developed a more adaptive and data-driven educational evaluation system. Learning evaluation in Singapore is designed to capture students' learning processes comprehensively through the use of digital technologies and learning analytics. This approach enables teachers and educational institutions to respond more precisely and sustainably to students' learning needs, in line with the student-centered learning paradigm that underpins Singapore's national education policy (OECD, 2021).

Against this backdrop, a comparative study between Indonesia and Singapore becomes particularly relevant. This study is grounded in the observation that disparities in the application of deep learning within modern educational evaluation systems are shaped not only by technological availability but also by policy frameworks, institutional readiness, and the capacity of human resources in education. The contribution of this study lies in enriching the discourse on educational evaluation by positioning deep learning as an analytical tool for understanding learning processes, rather than merely as a support for digital instruction. Accordingly, this study aims to examine the integration of deep learning concepts in modern educational evaluation through a comparative

analysis of Indonesia and Singapore, while identifying the key factors influencing differences in their implementation.

LITERATURE REVIEW

Modern Educational Evaluation

Modern educational evaluation is no longer understood merely as a process of measuring learning outcomes, but rather as an integral component of continuous learning. This approach positions evaluation as a means of understanding students' overall development, including cognitive aspects, learning processes, and the achievement of long-term competencies. The OECD (2021) emphasizes that effective evaluation systems should be closely integrated with curricula and instructional practices and supported by the systematic and sustained use of educational data. Such evaluation enables more responsive educational decision-making that aligns with students' learning needs.

In line with this perspective, modern educational evaluation also requires a shift from summative assessment toward formative assessment that focuses on improving the learning process. Evaluation is no longer positioned as a selection tool, but as a reflective mechanism that assists educators in adjusting instructional strategies. This shift provides an important foundation for the integration of digital technologies within contemporary educational evaluation systems.

Deep Learning Concepts in Educational Evaluation

As a branch of artificial intelligence, deep learning has the capacity to analyze large and complex datasets and identify patterns that are difficult to detect through conventional methods. In educational contexts, this technology enables the analysis of students' learning behaviors, the identification of learning difficulties, and the provision of more adaptive feedback. Holmes, Bialik, and Fadel (2019) argue that the application of deep learning in education should be directed toward enhancing the quality of learning evaluation, rather than merely automating academic assessment.

Furthermore, deep learning has the potential to transform evaluation from a measurement tool into a diagnostic instrument for learning. Through continuous analysis of learning data, deep learning-based evaluation can support educators in gaining deeper insights into students' learning needs. However, the effectiveness of this technology largely depends on the readiness of the education system and the competence of the human resources involved.

Technology Integration and Education Policy

The successful integration of deep learning into educational evaluation is influenced not only by technological sophistication but also by educational policy and governance contexts. Williamson and Eynon (2020) emphasize that the implementation of artificial intelligence in education is fundamentally a social and policy-driven process, rather than a purely technical innovation. Without a clear policy framework and adequate institutional support, AI-based evaluation technologies risk becoming symbolic innovations with limited impact on instructional practice.

In the Indonesian context, policies promoting digital transformation in education have created opportunities for the use of technology in learning and evaluation. Nevertheless, various studies indicate that the implementation of technology-based evaluation continues to face challenges, particularly in relation to teacher readiness and the integration of evaluation systems with instructional processes (Suryani & Fatmawati, 2021; Kemendikbudristek, 2022). This suggests that the adoption of deep learning in educational evaluation requires strong alignment between policy direction, educational systems, and human resource capacity.

A Comparative Perspective: Indonesia and Singapore

Comparative approaches in educational research allow for a deeper examination of differences in evaluation systems and practices across countries. Singapore is frequently referenced in discussions of data-driven educational evaluation due to its success in integrating digital technologies into its education system in a systematic manner. According to the OECD (2021), educational evaluation in Singapore is designed to support student-centered learning through the use of learning data and educational analytics.

In contrast, Indonesia remains at a developmental stage in the application of data-driven evaluation technologies. These differences make a comparative study between Indonesia and Singapore particularly relevant for identifying the factors that influence the successful integration of deep learning in modern educational evaluation, as well as for formulating context-sensitive policy implications for Indonesia.

METHODOLOGY

Research Method

This study adopts a qualitative approach with a comparative research design to examine the integration of deep learning concepts in modern educational evaluation systems in Indonesia and Singapore. The qualitative approach is appropriate because the study emphasizes interpretive analysis of educational policies, systems, and evaluation practices rather than statistical testing of variable relationships.

Data Sources

The study utilizes secondary data derived from credible sources, including national education policy documents, international reports, and peer-reviewed academic publications related to educational evaluation and deep learning. Key data sources include OECD reports, international scholarly literature on artificial intelligence in education, and official education policy documents from Indonesia and Singapore. The selection of data sources was conducted purposively based on relevance, credibility, and publication period (2019–2024).

Data Collection

Data were collected through document analysis of policy documents, research reports, and academic journal articles addressing technology-enabled

educational evaluation and the application of deep learning. The analysis focused on information related to evaluation objectives, evaluation frameworks, the use of learning analytics, and policy implications for evaluation practices in both national contexts.

Data Analysis

The data were analyzed using thematic analysis to identify key patterns and recurring themes across the reviewed documents. The identified themes include educational evaluation paradigms, the role of deep learning in evaluation processes, system readiness, and policy environments influencing technology-based evaluation. A comparative analytical approach was then employed to examine similarities and differences in the implementation of deep learning in educational evaluation systems in Indonesia and Singapore.

Trustworthiness of the Study

To enhance the trustworthiness of the study, source triangulation was applied by cross-referencing information from multiple documents and publications. Analytical consistency was ensured by anchoring the interpretation of findings within established conceptual and theoretical frameworks, thereby strengthening the credibility and academic rigor of the analysis.

RESULT AND DISCUSSIONS

Result

This section presents the findings of a comparative analysis on the integration of deep learning concepts in modern educational evaluation systems in Indonesia and Singapore. The results are organized around key themes derived from the analysis of policy documents, international reports, and relevant scholarly literature.

Educational Evaluation Paradigms

The analysis reveals a clear difference in educational evaluation paradigms between Indonesia and Singapore. In Indonesia, educational evaluation remains largely dominated by outcome-based assessment approaches, particularly through examinations and summative assessments. Evaluation is more frequently positioned as a tool for measuring students' final achievement, with the use of learning data still largely limited to administrative purposes.

In contrast, Singapore adopts an evaluation paradigm that is more strongly oriented toward learning processes. Evaluation is designed as an integral component of continuous teaching and learning activities, with the primary objective of gaining a holistic understanding of students' learning development. The use of learning data serves as a foundation for educational decision-making at both classroom and institutional policy levels.

Use of Deep Learning in Evaluation Systems

The findings indicate that the use of deep learning in educational evaluation in Indonesia remains at an early stage. Digital technologies are primarily employed to support online assessments and score management, while the application of deep learning as an analytical tool for examining learning processes has not yet been systematically integrated. As a result, technological implementation tends to be partial and often depends on individual initiatives or specific projects.

In Singapore, deep learning has been utilized more strategically within educational evaluation systems. The technology is applied to analyze students' learning patterns, identify learning difficulties at an early stage, and provide adaptive feedback. Data-driven evaluation systems enable more personalized and responsive learning approaches that are aligned with students' diverse learning needs.

System Readiness and Education Policy

Differences in the level of deep learning integration within educational evaluation are also influenced by system readiness and education policy in each country. In Indonesia, despite the introduction of policies aimed at promoting digital transformation in education, practical implementation continues to face various challenges, including infrastructure limitations, educator competencies, and the lack of integration between evaluation systems and artificial intelligence-based learning analytics.

By contrast, Singapore demonstrates a higher level of system readiness, characterized by coherent and long-term oriented education policies. Evaluation systems are designed in alignment with curriculum frameworks and teacher professional development, allowing the use of deep learning in educational evaluation to be implemented in a sustainable and measurable manner.

Comparison of Educational Evaluation Systems in Indonesia and Singapore

To clarify the analytical findings, a summary comparison of educational evaluation systems in Indonesia and Singapore is presented in Table 1.

Table 1. Comparison of Deep Learning-Based Educational Evaluation Systems

Aspect	Indonesia	Singapore
Evaluation paradigm	Outcome-oriented evaluation	Process-oriented evaluation
Use of technology	Administrative functions and online assessments	Learning analytics and adaptive evaluation
Integration of deep learning	Limited and partial	Systematic and sustainable
Policy support	Under development	Integrated into national education policy
Evaluation implications	Measurement of final learning outcomes	Continuous learning development

The table shows that the main differences lie not only in the level of technology utilization, but also in the evaluation paradigm and the readiness of the education system as a whole.

Implications of Research Findings

The results of this study indicate that the successful integration of deep learning in modern educational evaluation is greatly influenced by the alignment between policy, education systems, and human resource capacity. Countries with an evaluation approach that is oriented towards process and continuous learning tend to be better prepared to effectively adopt data-based evaluation technology.

Discussions

This discussion interprets the research findings by linking them to relevant literature and conceptual frameworks on modern educational evaluation and the application of deep learning. The focus of the discussion is placed on explaining differences in educational evaluation systems between Indonesia and Singapore and their implications for improving educational quality.

Educational Evaluation as a Continuous Process

The findings indicate that Singapore positions evaluation as an integral component of the learning process rather than merely as a tool for measuring final outcomes. This finding is consistent with the OECD's (2021) perspective, which emphasizes that modern educational evaluation should function as a mechanism for continuous feedback to support adaptive learning. In this context, evaluation is oriented not only toward accountability but also toward the holistic development of students' potential.

In contrast, the predominantly outcome-oriented evaluation approach in Indonesia suggests that the formative function of evaluation has not yet been optimally utilized. This condition reflects a gap between the direction of educational transformation policies and evaluation practices at the operational level, particularly in the sustained use of learning data to support instructional improvement.

The Role of Deep Learning in Evaluation Transformation

The application of deep learning within Singapore's educational evaluation system demonstrates how technology can function as an analytical tool for gaining deeper insights into students' learning processes. Holmes, Bialik, and Fadel (2019) argue that artificial intelligence in education holds significant potential to support formative evaluation through learning pattern analysis, early prediction of learning difficulties, and adaptive feedback provision. The findings of this study reinforce this argument by showing that deep learning is utilized as a supporting instrument for pedagogical decision-making.

In Indonesia, the limited use of deep learning in educational evaluation indicates that technology is still largely perceived as an administrative tool rather than as a component of pedagogical strategy. This condition may hinder the

optimization of data-driven evaluation that could otherwise support more personalized and responsive learning experiences.

Policy Context and System Readiness

Differences in the level of deep learning integration in educational evaluation can also be understood through policy context and system readiness. Williamson and Eynon (2020) emphasize that the successful implementation of artificial intelligence in education depends heavily on policy coherence, institutional readiness, and educator competence. In Singapore, integrated and long-term oriented education policies enable the systematic use of evaluation technologies.

By contrast, although Indonesia has introduced policies aimed at promoting digital transformation in education, implementation continues to face structural challenges. Infrastructure gaps, variations in educator competencies, and the lack of integration between evaluation systems and deep learning-based learning analytics remain major barriers to the effective adoption of modern educational evaluation practices.

Implications for Educational Quality Development

The findings suggest that the integration of deep learning into educational evaluation cannot be separated from a broader shift in evaluation paradigms. Process-oriented and continuous evaluation frameworks provide a more conducive foundation for meaningful technology use. Therefore, the development of educational evaluation systems in Indonesia should focus not only on technological adoption but also on redefining the goals and functions of evaluation within the learning process.

Conceptually, this study contributes to the literature on educational evaluation by demonstrating that deep learning functions most effectively when supported by formative evaluation paradigms and coherent education policies. Practically, the findings may serve as a reference for policymakers and education practitioners in designing more adaptive and data-driven evaluation systems.

CONCLUSIONS AND RECOMMENDATIONS

Based on the findings and discussion, several key conclusions can be drawn. First, educational evaluation systems in Indonesia and Singapore differ fundamentally in their evaluation paradigms. Singapore positions evaluation as part of a continuous learning process and utilizes deep learning to analyze learning data adaptively, whereas Indonesia tends to position evaluation primarily as a tool for measuring final learning outcomes.

Second, the integration of deep learning in educational evaluation is more effective when supported by coherent education policies and a high level of system readiness. This finding indicates that successful implementation depends not only on technological sophistication but also on alignment between evaluation paradigms, policy frameworks, and human resource capacity.

Third, the limited use of deep learning in Indonesia's evaluation system highlights the need to reformulate educational evaluation approaches.

Evaluation practices that remain outcome-oriented may constrain the optimal use of learning data for pedagogical decision-making.

Implementation Implications

The findings of this study have several practical implications. First, educational institutions in Indonesia may begin to integrate deep learning-based learning analytics gradually into evaluation systems, particularly to support formative evaluation and ongoing monitoring of students' learning progress. Initial implementation can focus on utilizing existing digital learning data before developing more advanced systems.

Second, education policymakers should promote the development of more adaptive and data-driven evaluation policies. Such policies should move beyond the mere digitalization of assessment and encourage the use of evaluation data to improve learning processes and inform educational decision-making.

Third, this study may serve as an initial reference for educators and education managers in understanding the potential of deep learning as a supporting tool for learning evaluation. With appropriate implementation, this technology has the potential to enhance evaluation quality and support more personalized and sustainable learning.

FUTURE RESEARCH

This study has several limitations. First, it relies on secondary data in the form of policy documents and scholarly literature; therefore, the analysis does not directly represent the practical implementation of deep learning-based evaluation at the school or classroom level. Second, the scope of the study is limited to a comparison between Indonesia and Singapore, which restricts the generalizability of the findings to other educational contexts.

Future research is recommended to adopt empirical approaches, such as case studies or field-based research, to provide deeper insights into the implementation of deep learning in educational evaluation systems. Further studies may also expand the scope by including additional countries or educational levels to offer a more comprehensive comparative perspective on technology-driven educational evaluation.

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