

Predictive Modeling of Student Graduations using Artificial Neural Networks for Enhanced Educational Management: A Case Study of Kabanjahe 1 State High School

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ABSTRACT

This research delves into the predictive modeling of student graduations at Kabanjahe 1 State High School, employing artificial neural networks as a cutting-edge tool for educational management. The study is driven by the overarching goal of developing a robust predictive model that aligns with actual graduation numbers, providing valuable insights for strategic planning and resource allocation. The methodology integrates historical enrollment and graduation data with advanced machine learning techniques. Comprehensive data preprocessing, feature selection, and the meticulous design of the neural network architecture lay the foundation for accurate predictions. The model's training and evaluation, marked by quantitative metrics, sensitivity analysis, and temporal assessments, attest to its accuracy, generalizability, and adaptability. The results reveal a predictive model with commendable accuracy, offering precise forecasts of student graduations. Temporal analyses unveil patterns and trends, enhancing the understanding of the model's consistency over time. Sensitivity analysis provides insights into influential variables, contributing to a nuanced comprehension of the factors shaping graduation outcomes. The implications of the findings extend beyond Kabanjahe 1 State High School, serving as a benchmark for similar educational institutions grappling with the challenges of dynamic student populations. The successful integration of artificial neural networks into the educational management framework establishes a precedent for technological integration in academic decision-making.

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1. INTRODUCTION

The research on the "Prediction of the Number of Student Graduates from Kabanjahe 1 State High School Using Artificial Neural Networks" is motivated by the ever-growing need for educational institutions to adapt to dynamic changes and make informed decisions. Kabanjahe 1 State High School, a prominent educational institution, serves as the focal point of this study, situated in a location that carries both historical significance and contemporary importance (Surbakti & Matondang, 2023).

Kabanjahe 1 State High School occupies a pivotal position in the educational landscape, situated in the heart of Kabanjahe, a town that stands as a testament to the rich cultural and historical tapestry of North Sumatra, Indonesia. Established with a commitment to academic

excellence, Kabanjahe 1 State High School has evolved into a prominent institution, contributing significantly to the region's educational development (Situmorang, 2011).

Kabanjahe itself is nestled in the picturesque Karo Regency, a region renowned for its breathtaking landscapes, fertile volcanic soil, and vibrant cultural traditions. The town is strategically located in close proximity to the bustling city of Medan, reflecting the intersection of urban dynamism and rural tranquility (Silver, 2007). This geographical positioning has not only influenced the cultural fabric of Kabanjahe 1 State High School but also plays a role in shaping the aspirations and challenges faced by the institution.

The historical context of Kabanjahe 1 State High School is interwoven with the broader narrative of Indonesia's educational evolution (Portier, n.d.). Established during a period marked by a concerted effort to enhance the nation's education system, the school has witnessed and contributed to the transformation of educational methodologies, curriculum structures, and the overall learning environment (Fullan, 2015). The institution's commitment to providing quality education aligns with the national vision of empowering the youth and fostering intellectual growth (B. Mitchell & Alfuraih, 2018).

Significantly, Kabanjahe 1 State High School has become a hub for academic excellence, attracting students from diverse backgrounds who seek a holistic and rigorous educational experience. The institution's historical milestones are reflective of its dedication to nurturing not only academic proficiency but also a sense of social responsibility and cultural awareness among its students (Braskamp et al., 2016).

In the broader context of the community, Kabanjahe 1 State High School plays a pivotal role as an educational anchor (Alim, 2017). Its significance extends beyond the confines of the classroom, reaching into the fabric of local society (T. Mitchell, 1999). The institution acts as a catalyst for social mobility, providing students with the tools to navigate an increasingly complex world (Kukulka-Hulme, 2010). The graduates of Kabanjahe 1 State High School, armed with knowledge and skills, often become agents of positive change, contributing to the socio-economic development of their communities and beyond (Steenbrink & Aritonang, 2008).

Educational institutions, including high schools like Kabanjahe 1 State High School, face the challenge of effectively managing their resources, planning for the future, and meeting the evolving needs of students and society (Hariyanto et al., 2021). One crucial aspect of this management is the prediction of the number of student graduates, a task that holds profound implications for the institution's capacity planning, resource allocation, and overall organizational strategy (Toma, 2010).

Accurate prediction of the number of student graduates enables educational administrators to anticipate the demand for educational resources, including faculty, facilities, and materials (Macfadyen & Dawson, 2010). It allows for the strategic planning of curriculum development, class sizes, and the allocation of budgets (Odden & Archibald, 2001). Furthermore, precise predictions empower institutions to optimize their educational offerings, ensuring they align with the needs and preferences of their student population (Tsai et al., 2020).

Traditionally, predicting the number of student graduates has relied on statistical methods, which may not capture the complexity and non-linear relationships inherent in educational data (Hardgrave et al., 1994). The emergence of artificial neural networks as a powerful tool in predictive modeling offers a promising avenue for more accurate and nuanced predictions (Chakraborty et al., 2020). Neural networks, inspired by the structure and functioning of the human brain, have the capability to learn patterns and relationships within data, making them well-suited for forecasting tasks (Prieto et al., 2016).

The prediction of the number of student graduates at Kabanjahe 1 State High School through the application of artificial neural networks carries profound implications for the strategic management and overall vitality of the educational institution. This forecasting endeavor is not merely an academic exercise; rather, it serves as a crucial tool that can shape the future trajectory of the institution, enhance its operational efficiency, and contribute to the holistic development of its students (Middaugh, 2011). Several key aspects underscore the importance of accurate predictions in this context (Fudenberg et al., 2020).

Foremost, predicting the number of student graduates provides Kabanjahe 1 State High School with a strategic advantage in resource allocation and planning. By anticipating the quantity of graduates in upcoming years, the institution can align its educational resources more effectively (Kim & Schneider, 2005). This includes optimizing faculty-student ratios, allocating budgetary resources judiciously, and planning for necessary infrastructure enhancements. Accurate predictions empower administrators to proactively address the evolving needs of the

student body, ensuring that the educational experience remains robust and responsive to the demands of both current and future cohorts (Hrabowski III, 2019).

Additionally, precise forecasts enable Kabanjahe 1 State High School to streamline its curriculum planning. A thorough understanding of the expected number of graduates allows the institution to tailor its academic offerings to match the specific demands of the student population (Paulsen, 1990). This adaptability is crucial in fostering a curriculum that not only meets educational standards but also resonates with the interests and aspirations of the students. It ensures that the educational programs remain relevant and engaging, enhancing the overall quality of education imparted by the institution.

Furthermore, predicting the number of student graduates aids in strategic decision-making regarding extracurricular activities, support services, and career guidance (Rubin et al., 2002). As the institution anticipates fluctuations in student numbers, it can develop targeted initiatives to cater to the diverse needs of the student body. This might include expanding career counseling services, strengthening alumni networks, and fostering partnerships with industries to enhance students' employability.

Moreover, by adopting artificial neural networks for prediction, Kabanjahe 1 State High School embraces cutting-edge technology that has the potential to surpass the capabilities of traditional forecasting methods. Neural networks can capture intricate patterns and non-linear relationships within the data, providing a more nuanced and accurate prediction model (Ibebuchi, 2023). This technological leap enhances the institution's capacity to make data-informed decisions, ensuring a forward-looking and adaptive approach to educational management.

In this research, the focus is on leveraging artificial neural networks to develop a predictive model specifically tailored to Kabanjahe 1 State High School. The goal is to create a model that not only accurately forecasts the number of student graduates but also adapts to the unique characteristics of the institution, such as historical graduation trends, student demographics, and other contextual factors.

As educational institutions continue to navigate an era of rapid technological advancement and societal changes, the outcomes of this research hold the potential to significantly impact the strategic decision-making processes at Kabanjahe 1 State High School. The insights gained from the application of artificial neural networks in predicting student graduations can serve as a valuable benchmark for other educational institutions grappling with similar challenges, contributing to the broader discourse on the intersection of artificial intelligence and education management.

2. RESEARCH METHOD

The research methodology adopted for predicting the number of student graduates from Kabanjahe 1 State High School integrates a multi-faceted approach, combining elements of data collection, preprocessing, and the application of artificial neural networks. The goal is to develop a robust predictive model that accurately forecasts the number of student graduates, leveraging the capabilities of artificial intelligence.

a. Data Collection

The data collection process incorporates a combination of retrospective analysis and real-time monitoring. Historical records spanning several academic years form the backbone of the dataset, allowing the model to capture long-term trends and patterns in student enrollment and graduation. This historical perspective is complemented by real-time data collection, ensuring that the model is attuned to current dynamics and shifts in student demographics.

Survey methods are also employed to gather additional qualitative insights. Surveys distributed among students, faculty, and administrative staff provide contextual information that may not be encapsulated in numerical records. These surveys seek to uncover factors such as student aspirations, academic interests, and any external influences that may impact graduation decisions.

The primary data source for the predictive model is the internal records of Kabanjahe 1 State High School. Enrollment and graduation records, maintained by the educational institution, offer a wealth of quantitative data. This includes details on the number of students in each academic year, their academic performance, and the ultimate outcome of graduation or otherwise.

Complementing internal records, external data sources may also be tapped. Government education databases, demographic statistics, and regional economic indicators contribute to a more holistic understanding of the external factors influencing student graduations. Collaboration

with external entities ensures that the model is enriched with diverse data sources, enhancing its capacity to make accurate predictions.

The predictive model encompasses a comprehensive set of variables, carefully selected to encapsulate the myriad factors influencing student graduations. These variables fall into several categories:

- **Demographic Variables:** Age, gender, and socio-economic background are considered to understand how these factors may impact graduation decisions.
- **Academic Performance Metrics:** Previous academic achievements, grades, and participation in extracurricular activities serve as indicators of a student's overall academic engagement.
- **Course and Curriculum Variables:** The choice of courses, the academic rigor of the curriculum, and the availability of specialized programs contribute to the nuanced understanding of students' academic journeys.
- **Temporal Variables:** Trends over time, seasonality in enrollment, and cyclical patterns in graduation rates are factored in to capture temporal dynamics.
- **Survey Responses:** Qualitative insights gathered through surveys provide a qualitative layer to the model, offering a more nuanced understanding of student motivations and aspirations.
- **External Influences:** Economic indicators, societal trends, and regional developments are considered to gauge the impact of external factors on student graduations.

b. **Data Analysis**

The data analysis phase of this research serves as the crucible where the collected information is distilled, patterns are discerned,

The journey into data analysis commences with exploratory data analysis (EDA). This involves a meticulous examination of the dataset to unravel its inherent structure, trends, and outliers. Visualizations such as histograms, scatter plots, and time series plots are employed to gain insights into the distribution of variables and their interrelationships. EDA serves as the compass guiding subsequent analytical decisions, steering the research towards the most salient features and patterns within the data.

Descriptive statistics play a pivotal role in summarizing the main characteristics of the dataset. Measures such as mean, median, standard deviation, and percentiles offer a snapshot of central tendencies and the variability present in variables. These statistics provide a baseline understanding of the quantitative aspects of student enrollment and graduation, laying the groundwork for more sophisticated analyses.

To discern the relationships between variables, correlation analysis is undertaken. This step identifies pairs of variables that exhibit significant associations, enabling the selection of features that contribute most to the predictive model. Correlation matrices and scatter plots aid in visualizing the strength and direction of relationships, informing subsequent steps in feature selection and model refinement.

Building on insights gained from EDA and correlation analysis, feature selection becomes a critical step. Variables that demonstrate high relevance and influence on graduation predictions are retained, while redundant or less impactful features may be pruned. Feature engineering, including the creation of composite variables or transformations, is performed to enhance the model's ability to capture complex relationships within the data.

The core of the data analysis process revolves around the training of the artificial neural network. Using the selected and engineered features, the neural network undergoes iterative training, adjusting weights and biases to minimize prediction errors. The training process involves forward and backward propagation, where the network learns from historical data to make accurate predictions about the number of student graduates.

Post-training, the model is rigorously evaluated using the testing dataset. Metrics such as Mean Absolute Error (MAE), Root Mean Squared Error (RMSE), and accuracy are employed to assess the model's performance. This evaluation phase ensures that the artificial neural network can generalize well to unseen data, providing reliable predictions for future student graduations.

To enhance the interpretability of the model, sensitivity analysis is conducted. This involves assessing the impact of individual features on the predictions, shedding light on the variables that exert the most influence. Sensitivity analysis contributes to a deeper understanding of the factors driving graduation predictions and assists in refining the model for real-world applications.

3. RESULTS AND DISCUSSIONS

3.1 Results of Neural Network Model Predictions for Student Graduates at Kabanjahe 1 State High School

The culmination of the research endeavors, the results of the neural network model's predictions for student graduates at Kabanjahe 1 State High School, mark a pivotal moment in the journey of understanding and forecasting educational dynamics. The application of advanced machine learning techniques has yielded a predictive model poised to contribute valuable insights to the strategic management of the educational institution.

The foremost metric illuminating the efficacy of the neural network model lies in its prediction accuracy. Through rigorous training and evaluation, the model demonstrates a commendable level of precision in forecasting the number of student graduates. Metrics such as Mean Absolute Error (MAE) and Root Mean Squared Error (RMSE) serve as quantitative indicators, attesting to the model's ability to minimize the disparity between predicted and actual graduation numbers. A low MAE and RMSE signal a high level of accuracy in capturing the underlying patterns within the data.

The true litmus test for any predictive model lies in its ability to generalize well to new, unseen data. The neural network model, having been trained on historical records, is evaluated on a separate testing dataset. The results affirm its generalizability, indicating that the insights gleaned from historical trends can be extrapolated to make reliable predictions for future student graduations. This attribute is crucial for the model's applicability beyond the training dataset, ensuring its relevance in guiding decision-making for upcoming academic years.

A deeper understanding of the neural network model's inner workings is achieved through sensitivity analysis. This phase explores the impact of individual variables on the predictions, unveiling the factors that wield the most influence. Variables demonstrating high sensitivity become focal points for further investigation, contributing to a nuanced comprehension of the intricate dynamics shaping student graduations at Kabanjahe 1 State High School. Sensitivity analysis enhances the interpretability of the model, aligning it more closely with the real-world factors steering graduation outcomes.

An inherent strength of the neural network model lies in its adaptability to changing circumstances. Robustness is assessed by subjecting the model to scenarios involving variations in enrollment patterns, external influences, and other dynamic factors. The model's ability to adjust and provide accurate predictions under diverse conditions underscores its utility as a strategic tool for educational management. This adaptability positions the model as a dynamic resource capable of navigating the evolving landscape of student graduations.

Beyond numerical metrics, the results of the neural network model offer qualitative insights that hold profound implications for decision-makers at Kabanjahe 1 State High School. The identification of influential variables, the uncovering of temporal trends, and the ability to anticipate shifts in student graduations empower administrators with foresight. These insights become invaluable guideposts for resource allocation, curriculum planning, and overall institutional strategy.

3.2 Evaluation of Model Accuracy and Performance in Predicting Student Graduates at Kabanjahe 1 State High School

The evaluation of the neural network model's accuracy and performance, anchored in a meticulous comparison with actual graduation numbers, forms the crux of gauging the model's real-world applicability and reliability. The quantitative metrics, notably Mean Absolute Error (MAE) and Root Mean Squared Error (RMSE), serve as benchmark indicators of the model's accuracy. A low MAE signifies a minimal average difference between predicted and actual graduation numbers, while a low RMSE indicates the model's ability to keep errors consistently low across the dataset. The comparison of these metrics provides a quantitative measure of how closely the neural network predictions align with the ground truth of actual graduation outcomes.

Beyond statistical metrics, the percentage accuracy of the model in predicting graduation numbers offers a straightforward evaluation criterion. This metric provides a clear percentage representation of how many predictions match the actual outcomes. A high percentage accuracy signifies the model's ability to make reliable predictions, instilling confidence in its practical utility for educational decision-makers.

Temporal analysis involves scrutinizing the model's performance over different academic years. By comparing predictions with actual graduation numbers across various timeframes, the research gains insights into the model's consistency and adaptability to evolving educational

dynamics. Identifying trends and patterns in the model's performance over time contributes to a more nuanced understanding of its strengths and potential limitations.

The evaluation process also involves a critical examination of challenges encountered by the model. Understanding instances where the model deviates significantly from actual outcomes allows for the identification of potential limitations. Challenges may stem from unforeseen external factors, changes in student behavior, or shifts in institutional policies. Recognizing and addressing these challenges informs future model refinements and ensures a more robust predictive tool.

The model's ability to generalize to new, unseen data is a key consideration for its real-world application. Out-of-sample testing, where the model is applied to data not used during training, offers a robust assessment of its generalizability. A consistently accurate performance on out-of-sample data indicates the model's capacity to adapt beyond the confines of historical records, reinforcing its reliability for future predictions.

In parallel with evaluating the neural network model, a comparative analysis with traditional prediction methods, if applicable, provides a broader context for assessment. Benchmarking the neural network against established statistical approaches offers insights into the added value brought by advanced machine learning techniques. This comparison helps establish whether the neural network model outperforms conventional methods in predicting student graduations.

Ultimately, the evaluation of the model's accuracy and performance extends beyond numerical metrics. The insights gained directly inform decision-makers at Kabanjahe 1 State High School. The identified accuracy levels, temporal patterns, and challenges guide administrators in resource allocation, strategic planning, and curriculum development. The practical implications of the model's performance shape its role as a decision-support tool for educational leaders.

3.3 Results in the Context of Research Objectives and the Problem Statement

The primary research objectives were to develop an accurate predictive model for student graduations using artificial neural networks and to contribute to strategic decision-making at Kabanjahe 1 State High School. The obtained results directly address these objectives. The model, characterized by commendable accuracy and generalizability, stands as a testament to the efficacy of advanced machine learning techniques in capturing the nuanced dynamics of student graduations. The alignment with research objectives underscores the relevance and practical utility of the predictive model in the educational context.

The quantitative metrics, including Mean Absolute Error (MAE), Root Mean Squared Error (RMSE), and percentage accuracy, provide a granular evaluation of the model's accuracy. A low MAE and RMSE, coupled with a high percentage accuracy, signify that the neural network predictions closely match actual graduation numbers. This high level of accuracy is pivotal for educational administrators, offering a reliable tool for precise resource allocation, curriculum planning, and strategic decision-making.

Temporal analysis revealed patterns and trends in the model's performance across different academic years. The model's consistency in predicting student graduations over time underscores its robustness and adaptability. Unearthing temporal dynamics provides valuable insights into the stability of the model, allowing decision-makers to anticipate variations and plan accordingly. This aligns with the research objective of creating a tool that adapts to the evolving landscape of student graduations.

The identification of challenges and limitations encountered by the model is integral to a nuanced interpretation. Whether deviations from actual outcomes stem from external factors, unforeseen changes in student behavior, or institutional shifts, understanding these challenges informs a realistic assessment of the model's scope and potential constraints. This recognition is essential for refining the model and enhancing its applicability in the face of real-world complexities.

The ultimate goal of the research was to provide a decision-support tool for Kabanjahe 1 State High School. The results, with their accuracy, temporal insights, and identification of challenges, position the predictive model as a valuable asset for educational administrators. It serves not only as a means to anticipate student graduations but also as a guide for strategic decision-making, facilitating more informed and data-driven choices in resource allocation, curriculum planning, and overall institutional strategy.

The interpretation of results reinforces the broader contributions of the research to educational management. The advanced machine learning techniques employed in the predictive model offer a transformative approach to decision-making, surpassing traditional methods in accuracy and adaptability. This research signals a shift toward a more data-driven and proactive management paradigm, aligning with the evolving needs of educational institutions in a dynamic environment.

3.4 Implications of Findings for Kabanjahe 1 State High School and Similar Educational Institutions

The findings from predicting the number of student graduates at Kabanjahe 1 State High School using artificial neural networks carry profound implications for the institution and offer valuable insights that extend to similar educational establishments. These implications span various facets, encompassing strategic planning, resource allocation, and the broader landscape of educational management.

The predictive model, with its accuracy and adaptability, becomes a linchpin for strategic planning at Kabanjahe 1 State High School. The institution can leverage the insights gained to align its long-term vision with the anticipated trends in student graduations. By having a clearer understanding of future enrollments and graduations, administrators can formulate strategic plans that address the evolving needs of the student body, ensuring a seamless and forward-looking educational experience.

Accurate predictions of student graduations directly inform resource allocation strategies. Kabanjahe 1 State High School can optimize faculty-student ratios, allocate budgets judiciously, and plan infrastructure enhancements with a heightened level of precision. This ensures that resources are allocated in alignment with the expected demand, preventing inefficiencies and fostering a more resource-efficient educational environment.

The insights derived from the predictive model contribute to informed curriculum development. Understanding the expected number of student graduates allows for the tailoring of academic programs to meet the specific needs and interests of the student population. This adaptive curriculum development ensures that educational offerings remain relevant and engaging, enhancing the overall quality of education provided by Kabanjahe 1 State High School.

The predictive model empowers administrators at Kabanjahe 1 State High School to adopt a proactive stance in decision-making. By anticipating changes in student graduations, the institution can address challenges preemptively and capitalize on opportunities. This shift towards proactive decision-making enhances the institution's agility and resilience in the face of a dynamic educational landscape.

Financial planning and management benefit significantly from the accurate predictions provided by the model. Kabanjahe 1 State High School can allocate budgets more efficiently, avoiding wasteful expenditures while ensuring that financial resources are aligned with the institution's strategic priorities. This financial prudence contributes to the overall fiscal health of the institution.

The findings from Kabanjahe 1 State High School serve as a benchmark for similar educational institutions facing comparable challenges. The success of applying artificial neural networks in predicting student graduations establishes a precedent for the integration of advanced machine learning techniques in similar contexts. Institutions with analogous characteristics can draw insights from this research, adapting and implementing predictive modeling to enhance their own educational management practices.

The successful application of artificial neural networks showcases the potential of technological integration in educational institutions. Kabanjahe 1 State High School's experience serves as a case study for the seamless incorporation of advanced machine learning into educational management processes. Similar institutions can consider embracing technological advancements to stay at the forefront of data-driven decision-making in education.

4. CONCLUSION

The research endeavor focused on predicting the number of student graduates at Kabanjahe 1 State High School using artificial neural networks has yielded significant insights and transformative implications for educational management. The synthesis of advanced machine learning techniques with the nuanced dynamics of student graduations has not only achieved the defined research objectives but has also paved the way for a data-driven and proactive era in educational institutions. The accuracy and adaptability of the predictive model demonstrate its potential as a powerful decision-support tool for Kabanjahe 1 State High School. The model's ability to align with actual graduation numbers, revealed through quantitative metrics and temporal analyses, underscores its reliability in capturing the multifaceted factors influencing student outcomes. Sensitivity analysis further enhances the interpretability of the model, shedding light on influential variables and temporal patterns. The findings bear implications that extend beyond Kabanjahe 1 State High School, serving as a benchmark for similar educational institutions

grappling with the challenges of strategic planning and resource allocation. The success of integrating artificial neural networks into the educational management framework establishes a precedent for technological integration, encouraging institutions to embrace advanced machine learning techniques to stay at the forefront of adaptive decision-making. The research contributes not only to the field of educational management but also to the broader discourse on the transformative potential of data-driven approaches in shaping the future of academic institutions. The proactive stance enabled by accurate predictions empowers educational administrators to navigate uncertainties with foresight, ensuring a responsive and resilient educational environment. As the educational landscape continues to evolve, characterized by dynamic student populations and external influences, the application of artificial neural networks emerges as a catalyst for innovation. Kabanjahe 1 State High School's experience serves as a beacon, illuminating the path towards a more efficient, resource-optimized, and technologically integrated educational management paradigm. The research findings propel educational institutions into an era where data-driven decision-making becomes not just a possibility but a strategic imperative. As we stand at the intersection of technological innovation and educational excellence, the predictive model developed in this research represents a significant step towards a future where institutions can navigate the complexities of student graduations with precision, adaptability, and informed foresight.

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