

Project E9: KAGGLE - STUDENTS' PERFORMANCE ANALYSIS

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Business Understanding Report

Identifying Your Business Goals

Background

High school academic performance forms the basis of opportunities that students will have in higher education and beyond. However, a student's grades are heavily influenced by several factors, including study habits, parental involvement, and extracurricular activities. In analyzing this dataset, we seek to gain insight into these factors and further develop a predictive model to identify students who might be at risk of poor performance, enabling timely intervention.

Business Goals

- Identify key factors that influence students' academic performance.
- Develop a predictive model that categorizes the students' grades into the following categories: 'A', 'B', 'C', 'D', 'F'.
- Provide actionable insights for educators and parents for targeted interventions.

Business Success Criteria

- The model must achieve an accuracy of at least 85% to predict the GradeClass variable.
- Provide interpretable results highlighting the top factors affecting performance.
- Based on the models developed, create a set of recommendations that can improve the academic outcomes of the students falling in grades 'C', 'D', and 'F' by at least 10%.

Assessing Your Situation

Resources Inventory

- Dataset: A synthetic dataset of 2,392 high school students with attributes such as demographics, study habits, parental involvement, extracurricular activities, and GPA.
- Tools and Technology: Python (for data preprocessing and modeling), machine learning libraries (e.g., Scikit-learn, TensorFlow), and visualization platforms (e.g., Tableau or Matplotlib).
- Human Resources: Data scientists, educators, and educational policy advisors.
- Infrastructure: Cloud-based resources for data storage and model training.

Requirements, Assumptions, and Constraints

- Requirements:
 - Access to all features in the dataset, particularly GPA, GradeClass, and other influencing factors like StudyTimeWeekly and ParentalSupport.
 - Collaboration with educational experts to validate insights.
- Assumptions:
 - The dataset accurately represents typical high school students' demographics and behaviors.
 - External factors like curriculum changes or policy variations do not significantly alter outcomes during the study.
- Constraints:
 - Limited time (three months) to complete analysis and modeling.
 - The synthetic nature of the dataset may limit generalizability to real-world applications.

Risks and Contingencies

- Risk: Data may be missing or biased, for instance, not having enough data for one ethnicity.
- Mitigation: Impute missing data and perform checks for bias in EDA.
- Risk: Model overfitting with a small/synthetic dataset.
- Mitigation: Perform robust cross-validation techniques, emphasize generalizability of the model.
- Risk: Educators might resist the recommendations. Mitigation: Communicate results in a digestible format, involve stakeholders early on.

Terminology

- **GradeClass:** The classification of the grades of students based on GPA.
- **Parental Support:** The involvement and assistance provided by parents in the student's academic life.
- **Extracurricular Activities:** Non-academic engagements like sports, music, and volunteering, which may influence performance.

Costs and Benefits

- **Costs:**
 - Time spent cleaning and analyzing the dataset.
 - Computational resources for running models.
 - Stakeholder engagement to validate findings.
- **Benefits:**
 - Improved academic performance and reduced failure rates.
 - Increased parental awareness and involvement in education.
 - Enhanced decision-making for school administrators and policymakers.

Defining Your Data-Mining Goals

Data-Mining Goals

- Develop a predictive model that classifies students into GradeClass categories ('A', 'B', 'C', 'D', 'F') based on GPA.
- Find the most relevant predictors for academic performance, like StudyTimeWeekly and ParentalSupport.
- Offer actionable insights to better support students in the lower categories of performance.

Data-Mining Success Criteria

- The model will achieve at least 85% accuracy in predicting GradeClass on test data.
- Provide feature importance rankings to identify the top factors in performance.
- Validate model effectiveness through a simulation or case study using a subset of the data.

<https://github.com/mattiasminejev/andmeteadus.git>