

STUDENT PERFORMANCE FACTORS

Visual Analytics Techniques Homework

Merve Pakcan Tufenk



INTRODUCTION

This project seeks to analyze and understand the factors that influence student performance.

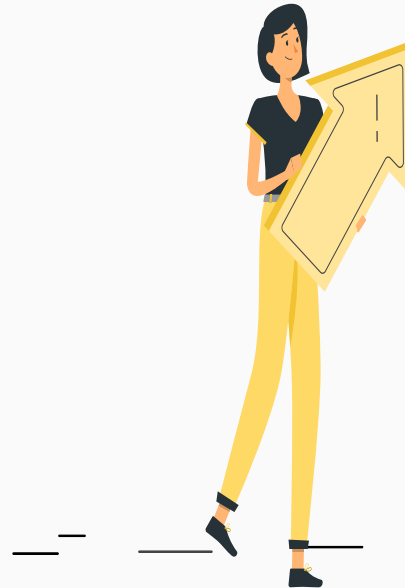
USER: Parents, administrators, educators, psychologists, counsellors

DATA: A comprehensive dataset of student performance metrics

TASK: Uncovering patterns, relationships, and key drivers of academic success to inform effective interventions

SDG 4
Quality
Education

SDG 10
Reduced
Inequalities



6600 ROWS

20 COLUMNS

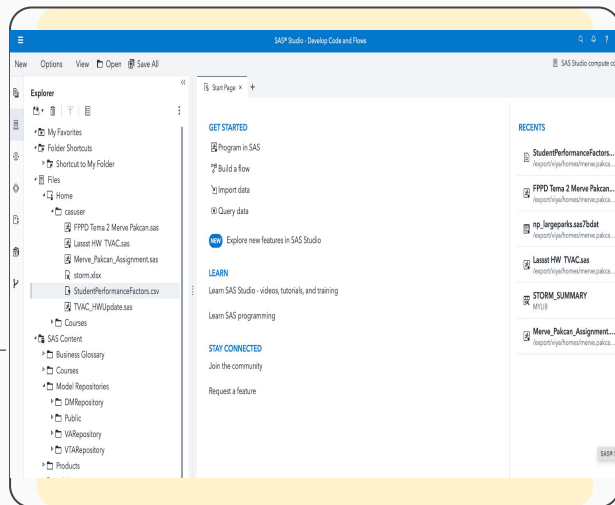
Student Performance Factors dataset from Kaggle

Uploaded CAS using *SAS Studio* -
Develop Code and Flows menu.

Loaded file into the CAS environment, within the CASUSER library, using *Manage Data* menu, **indicated by the green 'In-memory data' status.**

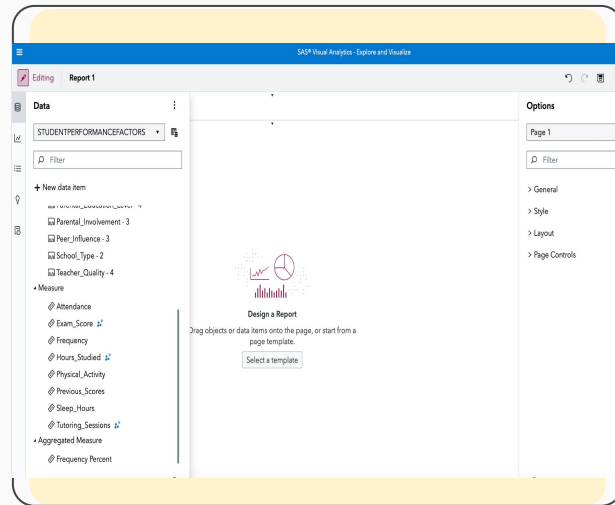
Data Sourcing & Acquisition

13 categorical variables, 7 numerical variables in *Explore and Visualize* menu.

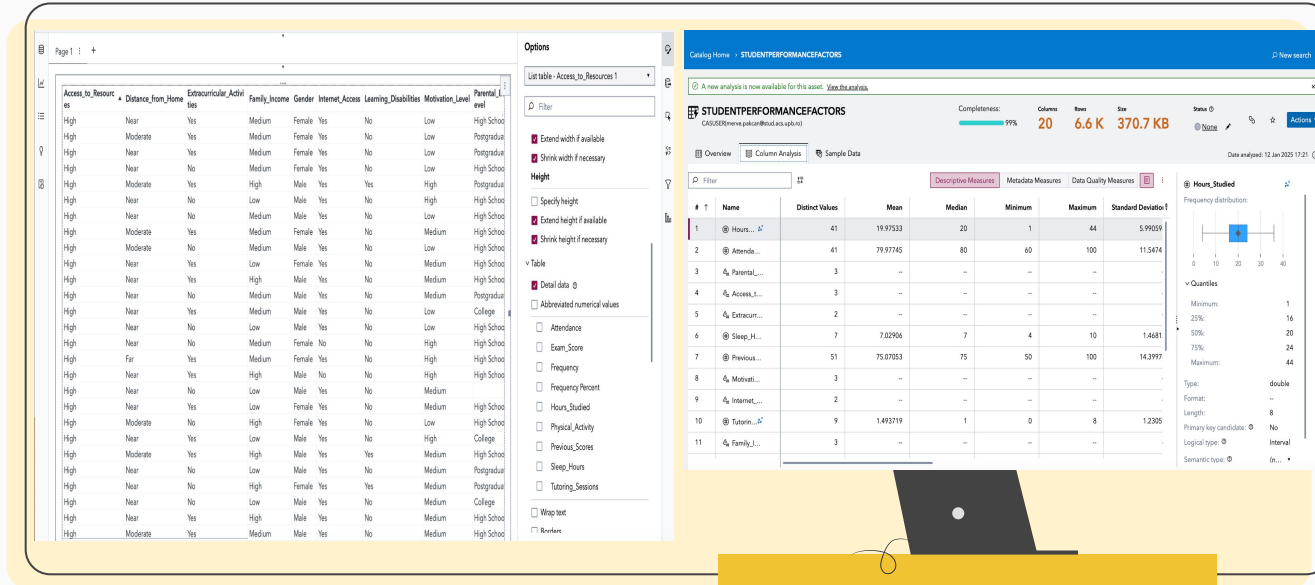


The screenshot shows the SAS Data Explorer interface with the 'STUDENTPERFORMANCEFACTORS' dataset selected. The 'Details' tab is active, displaying a table with 20 columns and 6600 rows. The table includes columns for ID, Name, Label, Data Type, Row Length, Formatted Length, and Format. The 'In-memory data (available)' status is highlighted in green.

| # | Name | Label | Data Type | Row Length | Formatted Length | Format |
|----|----------------------------|-------|-----------|------------|------------------|--------|
| 1 | Hours_Studied | -- | @ double | 8 | 12 | -- |
| 2 | Attendance | -- | @ double | 8 | 12 | -- |
| 3 | Parental_Involvement | -- | @ varchar | 6 | 6 | -- |
| 4 | Access_to_Resource | -- | @ varchar | 6 | 6 | -- |
| 5 | Extracurricular_Activities | -- | @ varchar | 3 | 3 | -- |
| 6 | Sleep_Hours | -- | @ double | 8 | 12 | -- |
| 7 | Previous_Scores | -- | @ double | 8 | 12 | -- |
| 8 | Motivation | -- | @ varchar | 6 | 6 | -- |
| 9 | Internet_Access | -- | @ varchar | 3 | 3 | -- |
| 10 | Tutoring_Sessions | -- | @ double | 8 | 12 | -- |
| 11 | Family_Income | -- | @ varchar | 6 | 6 | -- |
| 12 | Teacher_Quality | -- | @ varchar | 6 | 6 | -- |
| 13 | School_Type | -- | @ varchar | 7 | 7 | -- |



DATA WRANGLING



List table created, **no new data items** are needed. Data analyzed in Discover Information Assets part. Cross Tabulation is not proper due to high number of categorical variables



5836 ROWS

DATA PREPARATION

```
Code
1 libname mylib clear;
2
3 /* Defining the "libname" library to access the directory containing the data files */
4 libname libmervl '/export/riya/homes/merve.pakcan@stud.acs.upb.ro/casuser/';
5
6 /* Importing the dataset */
7 proc import datafile='/export/riya/homes/merve.pakcan@stud.acs.upb.ro/casuser/StudentPerformance.csv'
8   dms=csv out=libmervl.studperformance replace;
9   guessingrows=32767; /* Rhaures SAS scans all rows to correctly determine column types */
10  getnames=yes;
11 run;
12
13 /* Defining a macro variable for the dataset */
14 %let dataset = libmervl.studperformance;
15
16 /* Displaying dataset structure and variables */
17 proc contents data=dataset;
18 run;
19
20 /* Checking a sample of the dataset to ensure values loaded correctly */
21 proc print data=libmervl.studperformance (obs=10);
22 run;
23
24 /* Identifying Missing Values */
25 /* Using proc means with missing to identify missing values in numeric columns. */
26 proc means data=libmervl.studperformance n missing;
27   var Hours_Studied Attendance Sleep_Hours Previous_Scores Exam_Score;
28 run;
29
30 /* Checking for Missing Values in all categorical Variables */
31 proc freq data=libmervl.studperformance;
32   tables _all_ / missing;
33 run;
34
35 /* Discovered missing values in the categorical variables */
36 /* Missing values: Teacher_Quality, Parental_Education_Level, and Distance_from_Home */
37 proc freq data=dataset;
38   tables Teacher_Quality Parental_Education_Level Distance_from_Home / missing;
39 run;
```

Uploaded clean data to discover information assets part, shows that data is clean to analyze

The FREQ Procedure

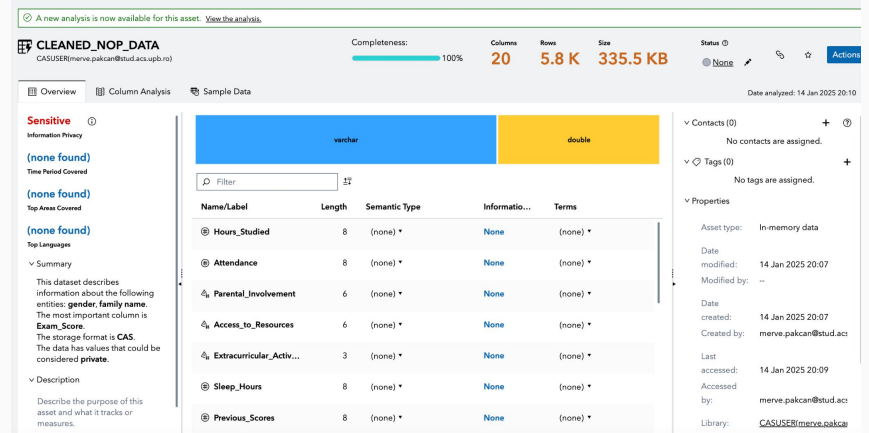
| Teacher_Quality | Frequency | Percent | Cumulative Frequency | Cumulative Percent |
|-----------------|-----------|---------|----------------------|--------------------|
| High | 1947 | 29.47 | 2025 | 30.65 |
| Low | 657 | 9.94 | 2682 | 40.59 |
| Medium | 3825 | 58.41 | 6607 | 100.00 |

| Parental_Education_Level | Frequency | Percent | Cumulative Frequency | Cumulative Percent |
|--------------------------|-----------|---------|----------------------|--------------------|
| College | 1989 | 30.10 | 2079 | 31.47 |
| High School | 3223 | 48.78 | 5302 | 80.25 |
| Postgraduate | 1305 | 19.75 | 6607 | 100.00 |

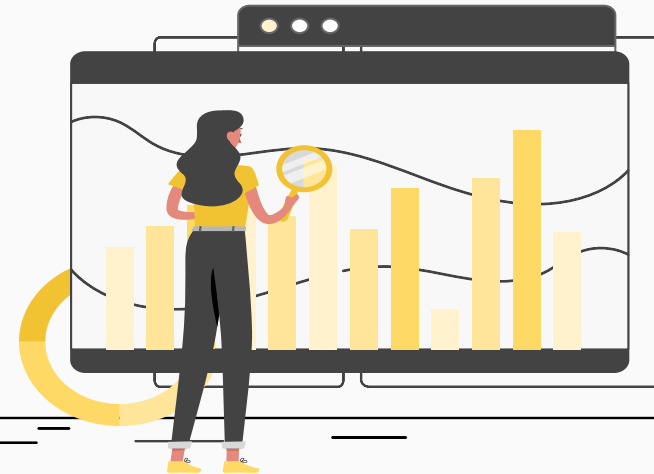
| Distance_from_Home | Frequency | Percent | Cumulative Frequency | Cumulative Percent |
|--------------------|-----------|---------|----------------------|--------------------|
| Far | 658 | 9.96 | 725 | 10.97 |
| Moderate | 1998 | 30.24 | 2723 | 41.21 |
| Near | 3884 | 58.79 | 6607 | 100.00 |

The MEANS Procedure

| Variable | N | Mean | Std Dev | Minimum | Maximum |
|-----------------|------|------------|------------|------------|-------------|
| Hours_Studied | 5836 | 20.0080535 | 5.7822916 | 4.0000000 | 36.0000000 |
| Attendance | 5836 | 80.0219328 | 11.4995264 | 60.0000000 | 100.0000000 |
| Sleep_Hours | 5836 | 7.0412954 | 1.4696616 | 4.0000000 | 10.0000000 |
| Previous_Scores | 5836 | 75.1077793 | 14.3481094 | 50.0000000 | 100.0000000 |
| Exam_Score | 5836 | 66.9883482 | 3.2301389 | 59.0000000 | 75.0000000 |



Eliminated missing values and outliers (small amount compared to dataset size), with using SAS Develop and Code part. No duplicate found.

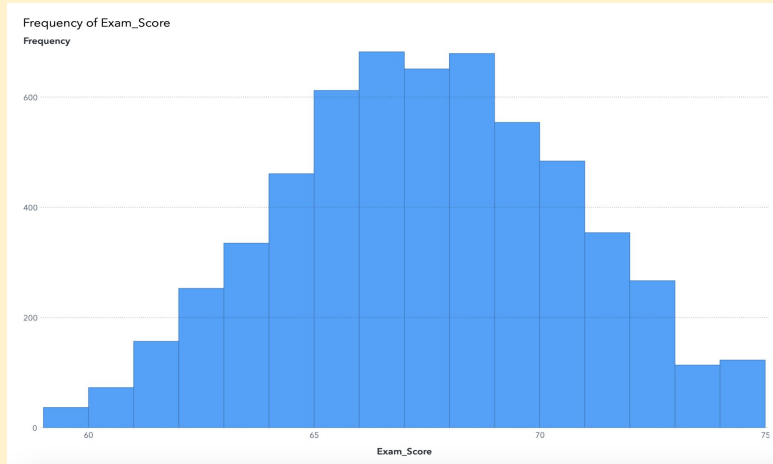


RESEARCH METHODOLOGY

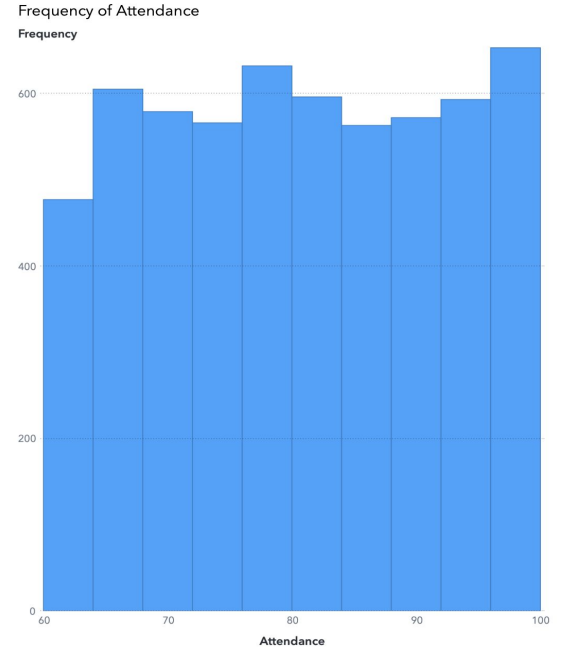
| QUESTION | SUB-QUESTION | VARIABLES | NOTES |
|--|---|---|---|
| What factors most influence student performance? | Which variables have the strongest correlation with Exam_Score? | <p>Dependent Variable: Exam_Score</p> <p>Independent Variable: Attendance, Hours_Studied, Previous_Scores, Parental_Involvement, Access_to_Resources, Extracurricular_Activities, Sleep_Hours, Previous_Scores, Motivation_Level, Internet_Access, Tutoring_Sessions, Family_Income, Teacher_Quality, School_Type, Peer_Influence, Physical_Activity, Learning_Disabilities, Parental_Education_Level, Distance_from_Home, Gender</p> | Needed to identify key variables of success. |
| What socioeconomic factors most impact exam results? | Which socioeconomic variables have the strongest correlation with Exam_Score? | <p>Dependent Variable: Exam_Score</p> <p>Independent Variable: Parental_Education_Level, Family_Income, Access_to_Resources ,Internet_Access, Distance_from_Home, Peer_Influence, Parental_Involvement</p> | Exploring educational equity and disparities. |

FIRST EXPLORATORY DATA ANALYSIS

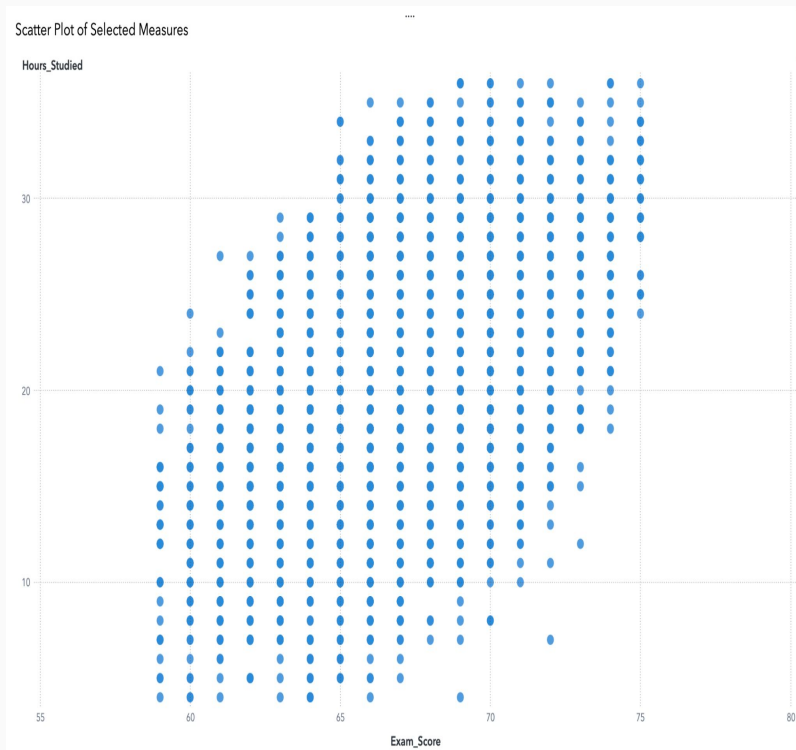
Target Variable



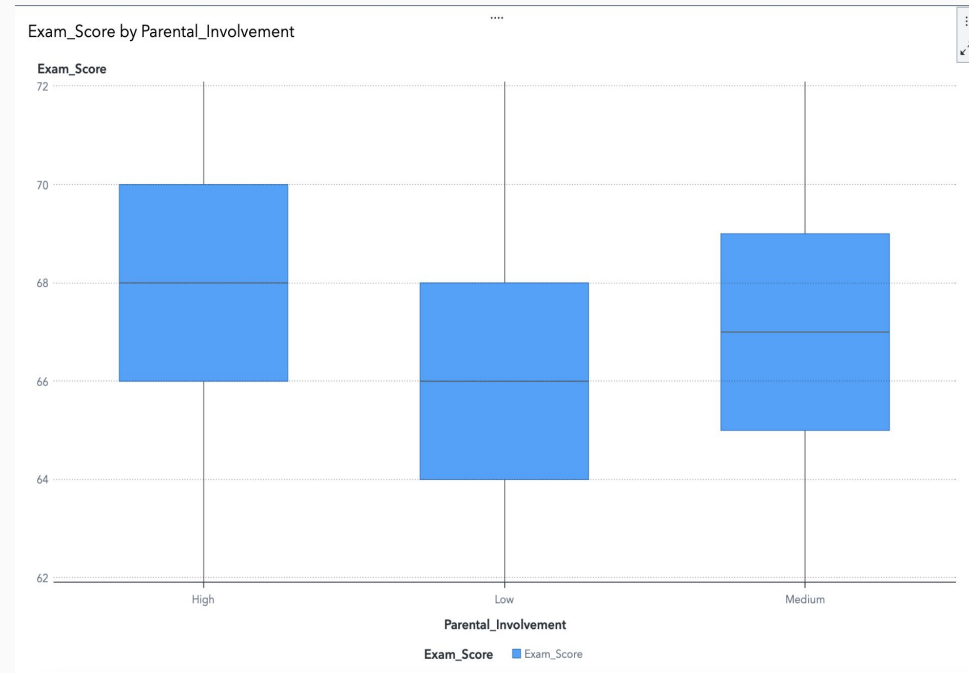
Shape: Bell-shaped distribution, **Center:** Around 67, **Spread:** Between 59 and 75



Uniform distribution



Positive correlation between hours studied and exam scores: as study hours increase, exam scores tend to increase

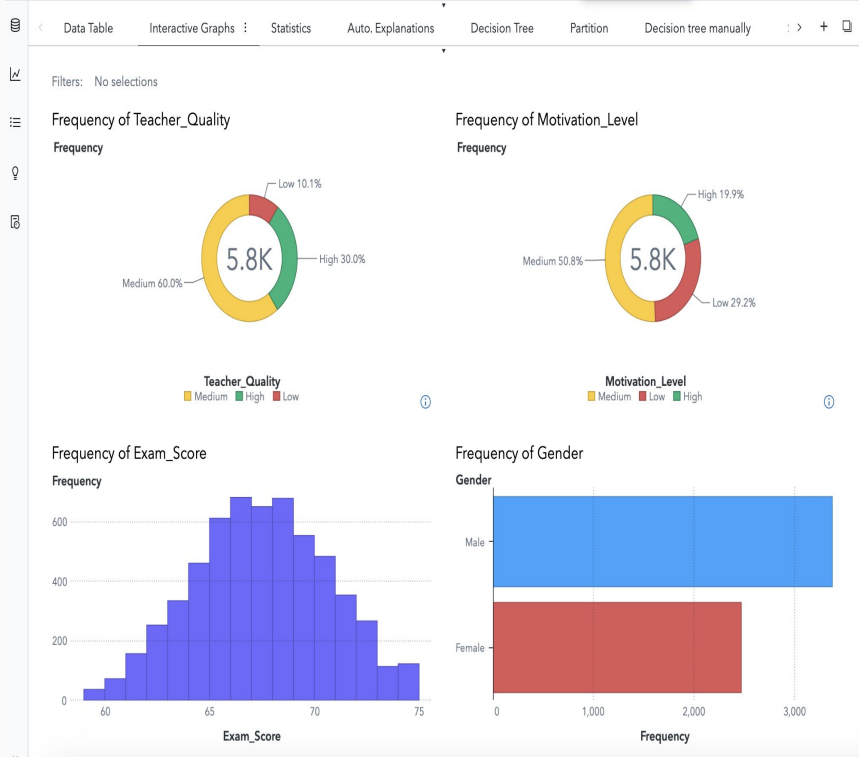
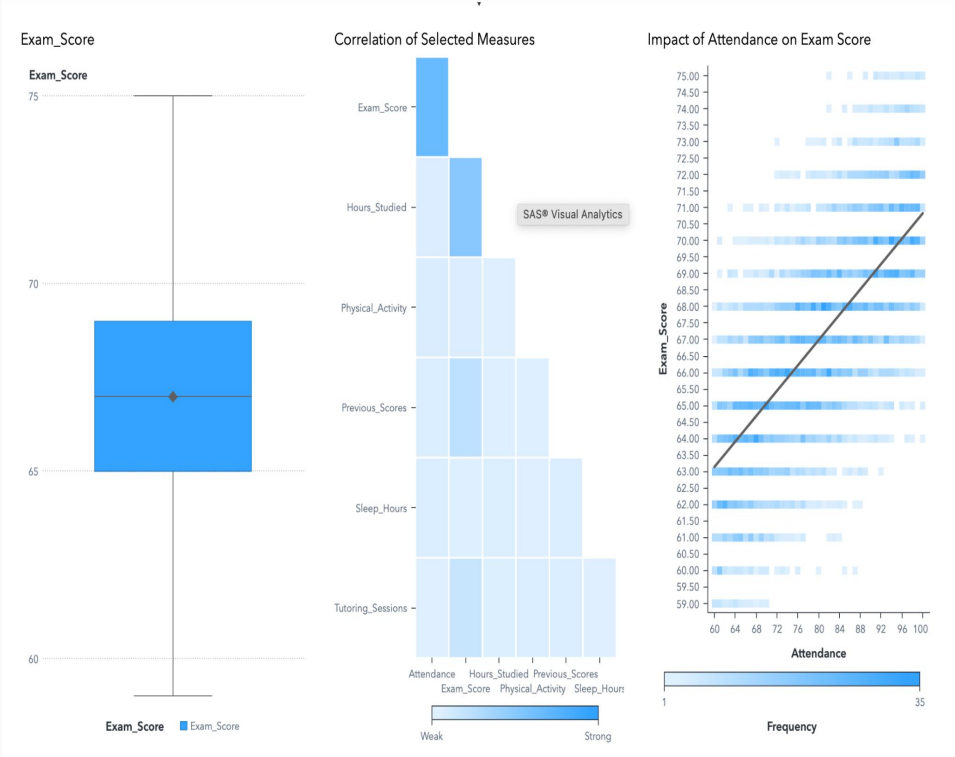


Positive correlation between parental engagement and academic success

The distribution of **Exam_Score** shows a median around 67. The range is relatively narrow. In correlation matrix and heatmap, a strong linear relationship exists between **Attendance** and **Exam_Score**

INVESTIGATE RELATIONSHIPS IN DATA

Additional interactive graphs created to understand variables more.



FOR QUESTION 1

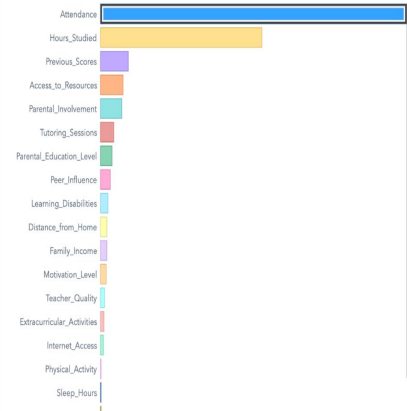
What factors most influence student performance?

FIRST STEP TO BUILD A DECISION

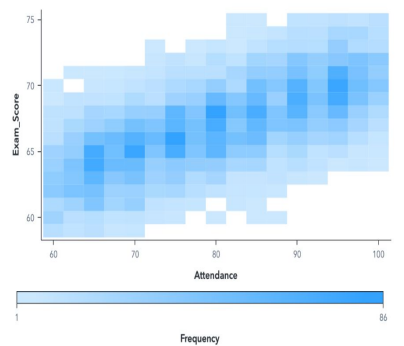
What are the characteristics of Exam_Score?

Exam_Score ranges from 59 to 75. Average Exam_Score is 67. Most cases (the middle 80%) have an Exam_Score between 63 and 71. Attendance best differentiates the highest (top 10%) and the lowest (bottom 10%) Exam_Score cases. The three most related factors are Attendance, Hours_Studied, and Previous_Scores.

What factors are most related to Exam_Score?



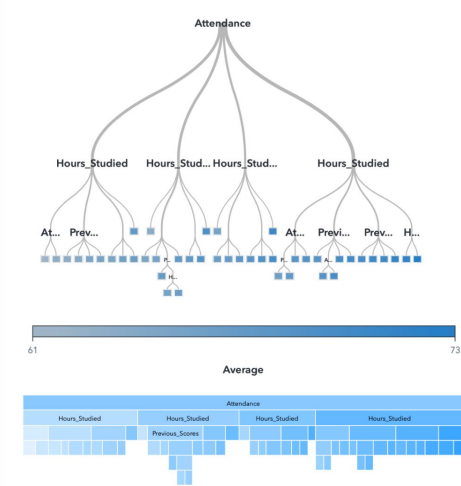
What is the relationship between Exam_Score and Attendance?



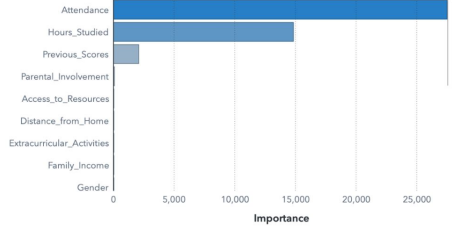
Decision Tree of Exam_Score

Fit: ASE 2.8 Observations: 5.8K of 5.8K

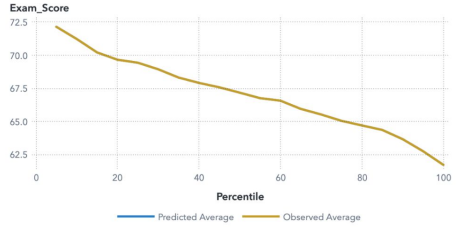
Tree



Variable Importance



Assessment



As it seen from automatic explanations and decision tree, the three most related factors are **Attendance**, Hours_Studied, Previous_Score



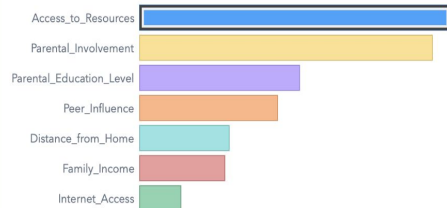
FOR QUESTION 2

What socioeconomic factors most impact exam results?

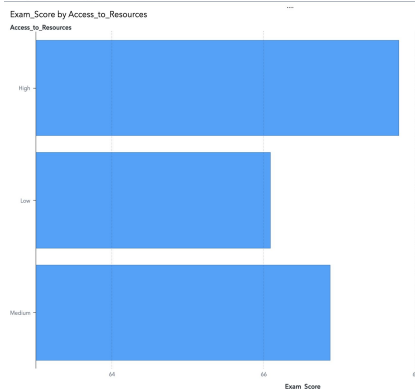
What are the characteristics of Exam_Score?

Exam_Score ranges from 59 to 75. Average Exam_Score is 67. Most cases (the middle 80%) have an Exam_Score between 63 and 71. Access_to_Resources best differentiates the highest (top 10%) and the lowest (bottom 10%) Exam_Score cases. The three most related factors are Access_to_Resources, Parental_Involvement, and Parental_Education_Level.

What factors are most related to Exam_Score?



What is the relationship between Exam_Score and Access_to_Resources?



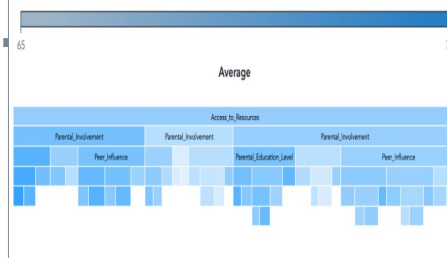
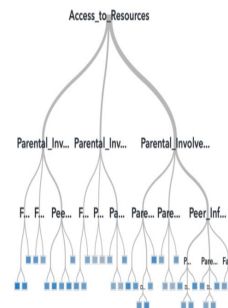
When Access_to_Resources is High, the average of Exam_Score is a high value. When Access_to_Resources is Low, the average of Exam_Score is a low value. The most common Access_to_Resources value is Medium.

As it seen from automatic explanations and decision tree, the three most related socioeconomic factors are **Access_to_Resources**, Parental_Involvement, Parental_Education_Level.

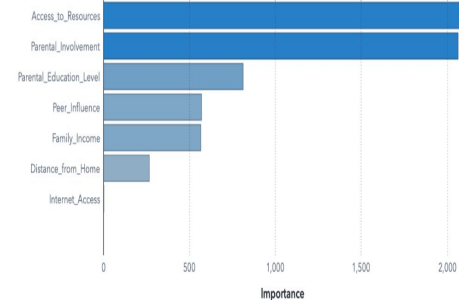
Decision Tree of Exam_Score

Fit: ASE 9.3 • Observations: 5.8K of 5.8K

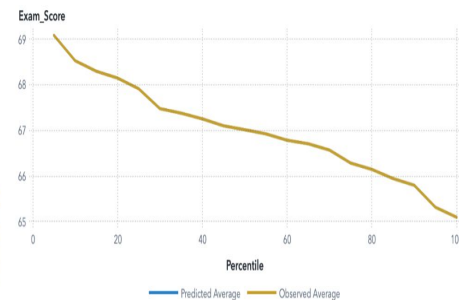
Tree



Variable Importance



Assessment



THANK YOU!

FINAL CONCLUSIONS

What was easy: Exploring patterns with visualization part
What was challenging: Some technical issues at Sas



| QUESTION | FINDINGS | DECISIONS |
|--|---|--|
| What factors most influence student performance? | Attendance and Hours_Studied are most related factors | The findings can support policymakers, educators, and institutions in designing targeted programs to improve student performance and reduce educational inequalities. |
| What socioeconomic factors most impact exam results? | Access_to_Resources , Parental_Involvement are most related factors | <ul style="list-style-type: none">• Empower families through community outreach to enhance parental engagement.• Promoting attendance and study habits while offering support for students that has low score |