FINAL v2

October 7, 2024

[1]: import pandas as pd

```
import numpy as np
     import seaborn as sns
     import matplotlib.pyplot as plt
     df = pd.read_csv(
         "/Users/gabrielmancillas/Documents/GitHub/StudentPerformancePrediction/

dataset.csv"

[2]: df.head()
[2]:
        Marital status Application mode Application order
                                                               Course
     0
                                                            5
                                                                     2
                      1
     1
                      1
                                                            1
                                                                    11
                                        6
     2
                      1
                                        1
                                                            5
                                                                     5
     3
                      1
                                        8
                                                            2
                                                                    15
     4
                                       12
                                                                     3
        Daytime/evening attendance Previous qualification Nacionality \
     0
                                  1
     1
                                  1
                                                           1
                                                                         1
     2
                                  1
                                                           1
                                                                         1
     3
                                  1
                                                           1
                                                                         1
     4
                                  0
                                                                         1
        Mother's qualification Father's qualification Mother's occupation
     0
                             13
                                                                                •••
     1
                              1
                                                       3
                                                                             4
     2
                             22
                                                      27
                                                                            10
     3
                             23
                                                      27
                                                                             6
     4
                             22
                                                      28
                                                                            10
        Curricular units 2nd sem (credited) Curricular units 2nd sem (enrolled)
     0
     1
                                            0
                                                                                  6
     2
                                            0
                                                                                  6
     3
                                            0
                                                                                  6
```

```
4
                                           0
                                                                                  6
        Curricular units 2nd sem (evaluations)
     0
     1
                                               6
     2
                                              0
     3
                                              10
     4
                                               6
        Curricular units 2nd sem (approved)
                                              Curricular units 2nd sem (grade)
     0
                                                                        0.000000
     1
                                            6
                                                                       13.666667
     2
                                            0
                                                                        0.000000
     3
                                            5
                                                                       12.400000
     4
                                            6
                                                                       13.000000
        Curricular units 2nd sem (without evaluations)
                                                          Unemployment rate
     0
                                                                        10.8
                                                       0
                                                                        13.9
     1
     2
                                                       0
                                                                        10.8
     3
                                                       0
                                                                        9.4
     4
                                                       0
                                                                        13.9
        Inflation rate
                        GDP
                                 Target
     0
                   1.4 1.74
                                Dropout
                  -0.3 0.79 Graduate
     1
                   1.4 1.74
                                Dropout
     3
                  -0.8 -3.12 Graduate
                  -0.3 0.79 Graduate
     [5 rows x 35 columns]
[3]: # numbers of students
     df.shape
[3]: (4424, 35)
[4]: df.rename(columns={"Nacionality": "Nationality"}, inplace=True)
[5]: df.describe().round(3)
[5]:
            Marital status Application mode
                                               Application order
                                                                      Course
                  4424.000
                                     4424.000
                                                         4424.000
                                                                   4424.000
     count
    mean
                     1.179
                                        6.887
                                                            1.728
                                                                       9.899
     std
                     0.606
                                        5.299
                                                            1.314
                                                                       4.332
                     1.000
    min
                                        1.000
                                                            0.000
                                                                       1.000
     25%
                     1.000
                                        1.000
                                                            1.000
                                                                       6.000
```

```
50%
                 1.000
                                    8.000
                                                        1.000
                                                                  10.000
75%
                 1.000
                                   12.000
                                                        2.000
                                                                  13.000
                 6.000
                                   18.000
max
                                                        9.000
                                                                  17.000
       Daytime/evening attendance Previous qualification Nationality
                          4424.000
                                                    4424.000
                                                                  4424.000
count
                              0.891
                                                                     1.255
mean
                                                       2.531
std
                              0.312
                                                       3.964
                                                                     1.748
                              0.000
                                                                     1.000
min
                                                       1.000
25%
                              1.000
                                                       1.000
                                                                     1.000
50%
                              1.000
                                                                     1.000
                                                       1.000
75%
                              1.000
                                                       1.000
                                                                     1.000
max
                              1.000
                                                      17.000
                                                                    21.000
                                Father's qualification
                                                          Mother's occupation \
       Mother's qualification
                      4424.000
                                                4424.000
                                                                      4424.000
count
                        12.322
                                                  16.455
                                                                         7.318
mean
std
                         9.026
                                                  11.045
                                                                         3.998
                                                   1.000
min
                         1.000
                                                                         1.000
25%
                         2.000
                                                   3.000
                                                                         5.000
50%
                        13.000
                                                  14.000
                                                                         6.000
75%
                        22.000
                                                  27.000
                                                                        10.000
max
                        29.000
                                                  34.000
                                                                        32.000
          Curricular units 1st sem (without evaluations)
count
                                                   4424.000
                                                      0.138
mean
std
                                                      0.691
                                                      0.000
min
25%
                                                      0.000
50%
                                                      0.000
75%
                                                      0.000
                                                     12.000
max
       Curricular units 2nd sem (credited)
count
                                    4424.000
                                       0.542
mean
std
                                       1.919
                                       0.000
min
25%
                                       0.000
50%
                                       0.000
75%
                                       0.000
max
                                      19.000
       Curricular units 2nd sem (enrolled)
                                    4424.000
count
                                       6.232
mean
```

```
2.196
std
min
                                       0.000
25%
                                       5.000
50%
                                       6.000
75%
                                       7.000
                                      23.000
max
       Curricular units 2nd sem (evaluations)
                                        4424.000
count
mean
                                           8.063
                                           3.948
std
min
                                           0.000
25%
                                           6.000
50%
                                           8.000
75%
                                          10.000
                                          33.000
max
       Curricular units 2nd sem (approved)
                                               Curricular units 2nd sem (grade)
                                    4424.000
                                                                         4424.000
count
                                       4.436
                                                                           10.230
mean
std
                                        3.015
                                                                            5.211
                                       0.000
min
                                                                            0.000
25%
                                       2.000
                                                                           10.750
50%
                                       5.000
                                                                           12.200
75%
                                       6.000
                                                                           13.333
max
                                      20.000
                                                                           18.571
       Curricular units 2nd sem (without evaluations)
                                                          Unemployment rate
                                                4424.000
                                                                    4424.000
count
                                                   0.150
                                                                      11.566
mean
std
                                                   0.754
                                                                        2.664
                                                   0.000
min
                                                                        7.600
25%
                                                   0.000
                                                                        9.400
50%
                                                   0.000
                                                                      11.100
75%
                                                   0.000
                                                                      13.900
max
                                                  12.000
                                                                      16.200
       Inflation rate
                              GDP
                        4424.000
              4424.000
count
mean
                 1.228
                           0.002
std
                 1.383
                            2.270
                -0.800
min
                          -4.060
25%
                 0.300
                          -1.700
50%
                 1.400
                           0.320
75%
                 2.600
                           1.790
                 3.700
                           3.510
max
```

[6]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 4424 entries, 0 to 4423
Data columns (total 35 columns):

# 	Column	Non-Null Count	Dtype
0	Marital status	4424 non-null	int64
1	Application mode	4424 non-null	int64
2	Application order	4424 non-null	int64
3	Course	4424 non-null	int64
4	Daytime/evening attendance	4424 non-null	int64
5	Previous qualification	4424 non-null	int64
6	Nationality	4424 non-null	int64
7	Mother's qualification	4424 non-null	int64
8	Father's qualification	4424 non-null	int64
9	Mother's occupation	4424 non-null	int64
10	Father's occupation	4424 non-null	int64
11	Displaced	4424 non-null	int64
12	Educational special needs	4424 non-null	int64
13	Debtor	4424 non-null	int64
14	Tuition fees up to date	4424 non-null	int64
15	Gender	4424 non-null	int64
16	Scholarship holder	4424 non-null	int64
17	Age at enrollment	4424 non-null	int64
18	International	4424 non-null	int64
19	Curricular units 1st sem (credited)	4424 non-null	int64
20	Curricular units 1st sem (enrolled)	4424 non-null	int64
21	Curricular units 1st sem (evaluations)	4424 non-null	int64
22	Curricular units 1st sem (approved)	4424 non-null	int64
23	Curricular units 1st sem (grade)	4424 non-null	float64
24	Curricular units 1st sem (without evaluations)	4424 non-null	int64
25	Curricular units 2nd sem (credited)	4424 non-null	int64
26	Curricular units 2nd sem (enrolled)	4424 non-null	int64
27	Curricular units 2nd sem (evaluations)	4424 non-null	int64
28	Curricular units 2nd sem (approved)	4424 non-null	int64
29	Curricular units 2nd sem (grade)	4424 non-null	float64
30	Curricular units 2nd sem (without evaluations)	4424 non-null	int64
31	Unemployment rate	4424 non-null	float64
32	Inflation rate	4424 non-null	float64
33	GDP	4424 non-null	float64
34	Target	4424 non-null	object
dtvp	es: float64(5), int64(29), object(1)		

dtypes: float64(5), int64(29), object(1)

memory usage: 1.2+ MB

```
[7]: print(df.isna().sum())
     print("Total Missing: ", df.isna().sum().sum())
    Marital status
                                                        0
    Application mode
                                                        0
    Application order
                                                        0
    Course
                                                        0
    Daytime/evening attendance
                                                        0
    Previous qualification
                                                        0
                                                        0
    Nationality
    Mother's qualification
                                                        0
                                                        0
    Father's qualification
    Mother's occupation
                                                        0
    Father's occupation
                                                        0
                                                        0
    Displaced
    Educational special needs
                                                        0
    Debtor
                                                        0
    Tuition fees up to date
                                                        0
                                                        0
    Gender
    Scholarship holder
                                                        0
    Age at enrollment
                                                        0
    International
    Curricular units 1st sem (credited)
                                                        0
    Curricular units 1st sem (enrolled)
                                                        0
    Curricular units 1st sem (evaluations)
                                                        0
    Curricular units 1st sem (approved)
                                                        0
    Curricular units 1st sem (grade)
                                                        0
    Curricular units 1st sem (without evaluations)
                                                        0
    Curricular units 2nd sem (credited)
                                                        0
    Curricular units 2nd sem (enrolled)
                                                        0
    Curricular units 2nd sem (evaluations)
                                                        0
    Curricular units 2nd sem (approved)
                                                        0
    Curricular units 2nd sem (grade)
                                                        0
    Curricular units 2nd sem (without evaluations)
                                                        0
    Unemployment rate
                                                        0
    Inflation rate
                                                        0
    GDP
                                                        0
    Target
                                                        0
    dtype: int64
    Total Missing: 0
    we are working zero missing values
[8]: print("Total Duplicates: ", df.duplicated().sum())
    Total Duplicates: 0
[9]: df["Target"].value_counts()
```

[9]: Target

Graduate 2209 Dropout 1421 Enrolled 794

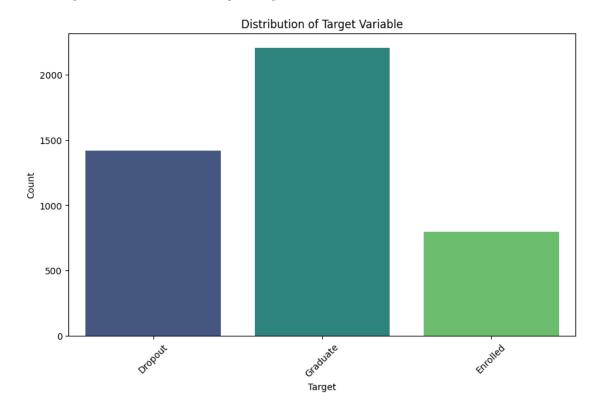
Name: count, dtype: int64

```
[10]: plt.figure(figsize=(10, 6))
    sns.countplot(data=df, x="Target", palette="viridis")
    plt.title("Distribution of Target Variable")
    plt.xlabel("Target")
    plt.ylabel("Count")
    plt.xticks(rotation=45)
    plt.show()
```

/var/folders/jw/4t4swxld5c5f_5xhv0_bzbr00000gn/T/ipykernel_21503/3590150.py:2: FutureWarning:

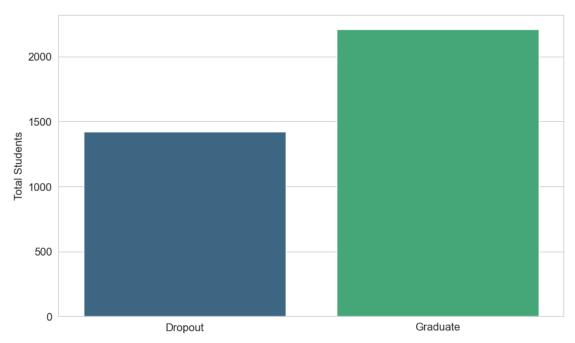
Passing `palette` without assigning `hue` is deprecated and will be removed in v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same effect.

sns.countplot(data=df, x='Target', palette='viridis')



```
[11]: df = df[df.Target != "Enrolled"]
[12]: df.shape
[12]: (3630, 35)
[13]: | freq_distribution = df["Target"].value_counts().to_frame(name="Count")
      freq_distribution["% of Total"] = (
          df["Target"].value_counts(normalize=True) * 100
      ).round(2)
      freq_distribution
Γ13]:
                Count % of Total
      Target
                 2209
                            60.85
      Graduate
                            39.15
      Dropout
                 1421
[14]: sns.set_style("whitegrid")
      plt.figure(figsize=(10, 6))
      sns.countplot(data=df, x="Target", palette="viridis") # Changed palette to_
      →'viridis'
      plt.ylabel("Total Students", fontsize=12)
      plt.xlabel(None)
      plt.title("Distribution of Target Variable", pad=20, fontsize=15)
      plt.xticks(fontsize=12)
      plt.yticks(fontsize=12)
     plt.show()
     /var/folders/jw/4t4swxld5c5f_5xhv0_bzbr00000gn/T/ipykernel_21503/1649841069.py:3
     : FutureWarning:
     Passing `palette` without assigning `hue` is deprecated and will be removed in
     v0.14.0. Assign the `x` variable to `hue` and set `legend=False` for the same
     effect.
       sns.countplot(data=df, x='Target', palette='viridis') # Changed palette to
     'viridis'
```

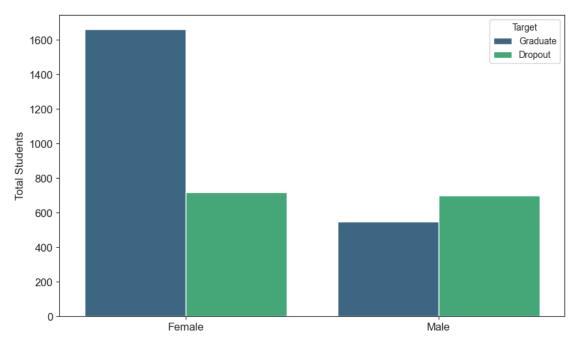
Distribution of Target Variable



```
[15]: sns.set_style("ticks")
  plt.figure(figsize=(10, 6))
  sns.countplot(data=df, x="Gender", hue="Target", palette="viridis")

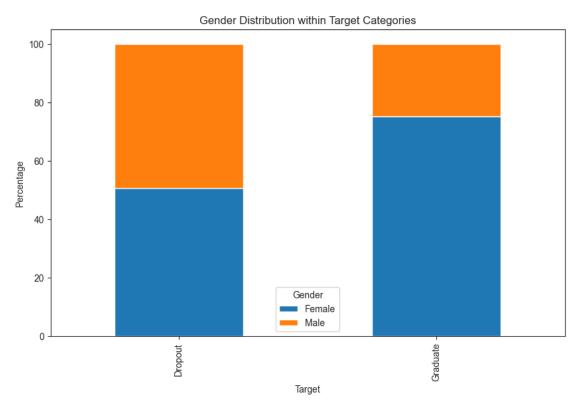
plt.xticks(ticks=[0, 1], labels=["Female", "Male"])
  plt.ylabel("Total Students", fontsize=12)
  plt.xlabel(None)
  plt.title("Distribution of Target by Gender", pad=20, fontsize=15)
  plt.xticks(fontsize=12)
  plt.yticks(fontsize=12)
```

Distribution of Target by Gender



```
[16]: # Calculate the crosstab of Target and Gender
      ct_gender = pd.crosstab(df["Target"], df["Gender"])
      # Rename columns for better readability
      ct_gender.columns = ["Female", "Male"]
      # Calculate the percentage distribution within each Target category
      ct_gender_percentage = ct_gender.div(ct_gender.sum(axis=1), axis=0) * 100
      # Display the crosstab with counts and percentages
      ct_gender_combined = ct_gender.copy()
      ct_gender_combined["Female (%)"] = ct_gender_percentage["Female"]
      ct_gender_combined["Male (%)"] = ct_gender_percentage["Male"]
      # Add a column for the total percentage
      ct_gender_combined["Total (%)"] = (
          ct_gender_combined["Female (%)"] + ct_gender_combined["Male (%)"]
      ct_gender_combined
      # Plot the percentage distribution using a stacked bar plot
      ct gender percentage.plot(
          kind="bar", stacked=True, figsize=(10, 6), color=["#1f77b4", "#ff7f0e"]
```

```
plt.title("Gender Distribution within Target Categories")
plt.xlabel("Target")
plt.ylabel("Percentage")
plt.legend(title="Gender")
plt.show()
```



```
# Create an interactive histogram with more bins
fig = px.histogram(
    df,
    x="Age at enrollment",
    nbins=30,
    title="Distribution by Age",
    labels={"Age at enrollment": "Age at Enrollment", "count": "Total
    Students"},
    color_discrete_sequence=["dodgerblue"],
)

# Customize the layout
fig.update_layout(
    title={"text": "Distribution by Age", "x": 0.5},
```

```
xaxis_title="Age at Enrollment",
  yaxis_title="Total Students",
  bargap=0.1,
)

# Show the plot
fig.show()
```

```
[24]: # Create an interactive count plot
      fig = px.histogram(
          df,
          x="Marital status",
          color="Target",
          barmode="group",
          title="Distribution of Target by Marital Status",
          labels={"Marital status": "Marital Status", "count": "Total Students"},
          color_discrete_sequence=["dodgerblue", "orange"],
      )
      # Customize the layout
      fig.update_layout(
          title={"text": "Distribution of Target by Marital Status", "x": 0.5},
          xaxis_title="Marital Status",
          yaxis_title="Total Students",
          bargap=0.1,
      # Change the x tick labels to the corresponding status
      fig.update_xaxes(
          tickvals=[1, 2, 3, 4, 5, 6],
          ticktext=[
              "Single",
              "Married",
              "Widower",
              "Divorced",
              "Defacto union",
              "Legally separated",
          ],
      )
      # Show the plot
      fig.show()
```

```
[47]: import plotly.express as px

# Group by Course and Target
student_courses = (
```

```
df.groupby(["Course", "Target"])
    .size()
    .reset_index()
    .pivot(columns="Target", index="Course", values=0)
student_courses = student_courses.rename(
    index={
        1: "Biofuel Production Technologies",
        2: "Animation and Multimedia Design",
        3: "Social Service (evening attendance)",
        4: "Agronomy",
        5: "Communication Design",
        6: "Veterinary Nursing",
        7: "Informatics Engineering",
        8: "Equinculture",
        9: "Management",
        10: "Social Service",
        11: "Tourism",
        12: "Nursing",
        13: "Oral Hygiene",
        14: "Advertising and Marketing Management",
        15: "Journalism and Communication",
        16: "Basic Education",
        17: "Management (evening attendance)",
    }
)
# Ensure the 'Dropout' column exists
if "Dropout" not in student_courses.columns:
    student_courses["Dropout"] = student_courses[0] # Assuming '0' represents_
 \hookrightarrow dropouts
# Sum the total number of students for each course and sort for the plot
student courses["Total"] = student courses.sum(axis=1)
student_courses_sorted = student_courses.sort_values(by="Total", ascending=True)
# Remove the 'Total' column
student_courses_sorted.drop(columns="Total", inplace=True)
# Generate the interactive plot
fig = px.bar(
    student_courses_sorted,
    orientation="h",
    title="Distribution of Target by Course",
    labels={"value": "Total Students", "Course": "Course"},
    color_discrete_sequence=px.colors.qualitative.Pastel,
)
```

```
# Customize the layout
fig.update_layout(
    title={"text": "<b>Distribution of Target by Course</b>", "x": 0.5},
    xaxis_title="<b>Total Students</b>",
    yaxis_title=None,
    barmode="stack",
    width=1200, # Increase the width
    height=800, # Increase the height
)

# Show the plot
fig.show()
```

[53]:	Target	Dropout Rate	Graduate Rate
	Course	_	
	Biofuel Production Technologies	88.889	11.111
	Oral Hygiene	47.826	52.174
	Equinculture	65.000	35.000
	Informatics Engineering	86.792	13.208
	Basic Education	59.859	40.141
	Communication Design	27.717	72.283
	Agronomy	49.711	50.289
	Animation and Multimedia Design	46.067	53.933
	Social Service (evening attendance)	36.598	63.402
	Tourism	45.498	54.502
	Advertising and Marketing Management	43.182	56.818
	Management (evening attendance)	63.551	36.449
	Veterinary Nursing	34.351	65.649
	Management	49.265	50.735
	Journalism and Communication	34.007	65.993
	Social Service	20.767	79.233
	Nursing	17.718	82.282

0.0.1 Feature Selection

```
[55]: df = pd.get_dummies(df, columns=["Target"])
      df.head()
[55]:
         Marital status
                          Application mode Application order
                                                                       2
      1
                       1
                                          6
                                                               1
                                                                      11
      2
                       1
                                          1
                                                               5
                                                                       5
                                                               2
                                                                      15
      3
                       1
                                          8
      4
                       2
                                         12
                                                               1
                                                                       3
         Daytime/evening attendance Previous qualification Nationality \
      0
      1
                                    1
                                                              1
                                                                            1
      2
                                    1
                                                              1
                                                                            1
      3
                                    1
                                                              1
                                                                            1
      4
                                    0
                                                              1
                                                                            1
         Mother's qualification Father's qualification Mother's occupation
      0
                               13
                                                        10
      1
                               1
                                                         3
                               22
                                                        27
      2
                                                                               10
      3
                               23
                                                        27
                                                                                6
      4
                               22
                                                        28
                                                                               10
         Curricular units 2nd sem (enrolled)
      0
                                              6
      1
      2
                                              6
      3
                                              6
      4
                                              6
         Curricular units 2nd sem (evaluations)
      0
                                                 0
                                                 6
      1
      2
                                                 0
      3
                                                10
      4
                                                 6
         Curricular units 2nd sem (approved)
                                                Curricular units 2nd sem (grade)
      0
                                                                          0.000000
                                              0
                                              6
      1
                                                                          13.666667
      2
                                              0
                                                                           0.000000
      3
                                              5
                                                                          12.400000
      4
                                              6
                                                                          13.000000
         Curricular units 2nd sem (without evaluations) Unemployment rate \
```

```
1
                                                         0
                                                                          13.9
      2
                                                        0
                                                                          10.8
      3
                                                         0
                                                                          9.4
      4
                                                         0
                                                                          13.9
         Inflation rate
                                Target_Dropout Target_Graduate
                           GDP
      0
                     1.4 1.74
                                           True
                                                            False
                   -0.3 0.79
                                          False
                                                             True
      1
      2
                     1.4 1.74
                                           True
                                                            False
                   -0.8 -3.12
                                          False
                                                             True
      3
                   -0.3 0.79
                                          False
                                                             True
      [5 rows x 36 columns]
[56]: dummies_to_drop = ["Target_Graduate"]
      df.drop(columns=dummies_to_drop, inplace=True)
      df.rename(columns={"Target_Dropout": "Target"}, inplace=True)
      df.head()
[56]:
         Marital status
                         Application mode Application order
                                                              5
                                                                      2
      0
                       1
                                          8
      1
                       1
                                          6
                                                              1
                                                                     11
                                                              5
      2
                       1
                                          1
                                                                      5
      3
                       1
                                          8
                                                              2
                                                                     15
                       2
                                         12
                                                              1
                                                                      3
         Daytime/evening attendance Previous qualification Nationality \
      0
                                   1
                                                             1
                                                                           1
      1
      2
                                                             1
                                   1
                                                                           1
      3
                                   1
      4
         Mother's qualification Father's qualification Mother's occupation
      0
                              13
                                                        10
                                                                               6
      1
                               1
                                                        3
                                                                               4
      2
                              22
                                                        27
                                                                              10
      3
                              23
                                                        27
                                                                               6
                              22
                                                        28
                                                                              10
         Curricular units 2nd sem (credited) Curricular units 2nd sem (enrolled)
      0
      1
                                             0
                                                                                    6
      2
                                             0
                                                                                    6
      3
                                             0
                                                                                    6
```

10.8

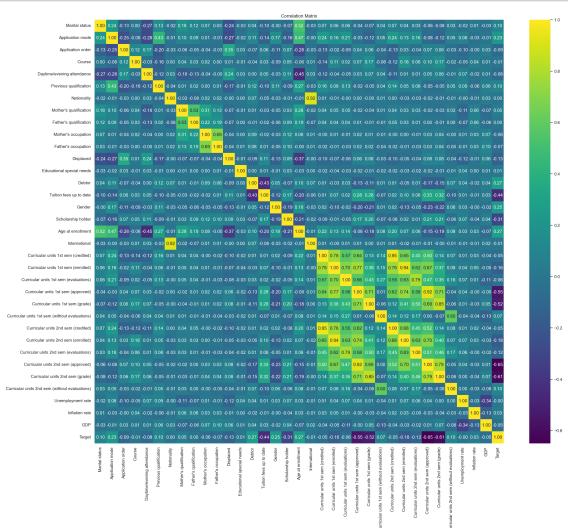
```
Curricular units 2nd sem (evaluations)
      0
      1
                                               6
      2
                                               0
      3
                                              10
      4
                                               6
         Curricular units 2nd sem (approved)
                                              Curricular units 2nd sem (grade)
      0
                                                                        0.000000
      1
                                            6
                                                                       13.666667
      2
                                            0
                                                                        0.000000
      3
                                            5
                                                                       12.400000
      4
                                            6
                                                                       13.000000
         Curricular units 2nd sem (without evaluations)
                                                          Unemployment rate \
      0
                                                                        10.8
                                                       0
      1
                                                                        13.9
                                                       0
                                                                        10.8
      2
      3
                                                       0
                                                                         9.4
      4
                                                       0
                                                                        13.9
                               Target
         Inflation rate
                         GDP
      0
                    1.4 1.74
                                  True
                   -0.3 0.79
      1
                                False
                    1.4 1.74
                                 True
      3
                   -0.8 -3.12
                                False
                   -0.3 0.79
                                False
      [5 rows x 35 columns]
[59]: # Set display options to show all columns and rows
      pd.set_option("display.max_columns", None)
      pd.set_option("display.max_rows", None)
      # Calculate the correlation matrix and round it to 2 decimal places
      correlation_matrix = df.corr().round(2)
      # Display the correlation matrix
      correlation_matrix
      # Reset display options to default values
      pd.reset_option("display.max_columns")
      pd.reset_option("display.max_rows")
```

0

6

4

```
[67]: sns.set(rc={"figure.figsize": (24, 20)}) # Increased the figure size sns.heatmap(correlation_matrix, annot=True, cmap="viridis", fmt=".2f") plt.title("Correlation Matrix") plt.show()
```

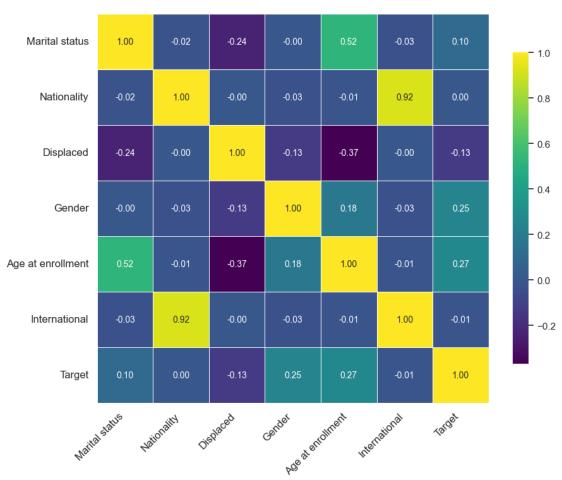


```
]
# Academic
academic_path = df[
        "Curricular units 1st sem (credited)",
        "Curricular units 1st sem (enrolled)",
        "Curricular units 1st sem (evaluations)",
        "Curricular units 1st sem (approved)",
        "Curricular units 1st sem (grade)",
        "Curricular units 1st sem (without evaluations)",
        "Curricular units 2nd sem (credited)",
        "Curricular units 2nd sem (enrolled)",
        "Curricular units 2nd sem (evaluations)",
        "Curricular units 2nd sem (approved)",
        "Curricular units 2nd sem (grade)",
        "Curricular units 2nd sem (without evaluations)",
        "Target",
    ]
]
```

```
[68]: sns.set(rc={"figure.figsize": (10, 8)})
sns.heatmap(
    demographics.corr().round(2),
    linewidths=0.5,
    annot=True,
    annot_kws={"size": 10},
    cmap="viridis",
    cbar_kws={"shrink": 0.8},
    fmt=".2f",
)

plt.title("Demographics Collinearity Heatmap", pad=20, fontsize=15)
plt.xticks(rotation=45, ha="right", fontsize=12)
plt.yticks(fontsize=12)
plt.show()
```

Demographics Collinearity Heatmap



```
[70]: features_to_drop = ["Nationality", "International"] features_to_drop
```

[70]: ['Nationality', 'International']

```
features_to_drop
[71]: ['Nationality',
       'International',
       'Curricular units 1st sem (credited)',
       'Curricular units 1st sem (enrolled)',
       'Curricular units 1st sem (evaluations)',
       'Curricular units 1st sem (approved)',
       'Curricular units 1st sem (grade)',
       'Curricular units 1st sem (without evaluations)',
       'Curricular units 2nd sem (credited)',
       'Curricular units 2nd sem (without evaluations)']
[72]: df.drop(features_to_drop, axis=1, inplace=True)
      df.head()
[72]:
         Marital status Application mode Application order Course \
                                                                     2
      0
                      1
      1
                      1
                                         6
                                                             1
                                                                    11
                                                             5
      2
                      1
                                         1
                                                                     5
      3
                      1
                                         8
                                                             2
                                                                    15
                                        12
                                                                     3
         Daytime/evening attendance Previous qualification Mother's qualification \
      0
                                   1
                                                            1
                                                                                    13
                                                                                     1
      1
                                   1
                                                            1
      2
                                                                                    22
                                   1
                                                            1
      3
                                                                                    23
                                   1
                                                            1
      4
                                   0
                                                            1
                                                                                    22
         Father's qualification Mother's occupation Father's occupation ... \
      0
                              10
                                                                          10
                              3
                                                     4
                                                                          4
      1
                              27
      2
                                                    10
                                                                          10
      3
                              27
                                                     6
                                                                          4
      4
                                                    10
                                                                         10
         Scholarship holder Age at enrollment Curricular units 2nd sem (enrolled)
      0
                           0
                                             20
      1
                           0
                                             19
                                                                                     6
      2
                                                                                     6
                           0
                                             19
      3
                                                                                     6
                           0
                                             20
      4
                           0
                                             45
                                                                                     6
         Curricular units 2nd sem (evaluations)
      0
```

```
1
                                                6
      2
                                                0
      3
                                               10
      4
                                                6
         Curricular units 2nd sem (approved)
                                               Curricular units 2nd sem (grade) \
      0
                                                                         0.000000
      1
                                             6
                                                                        13.666667
      2
                                             0
                                                                         0.000000
      3
                                             5
                                                                        12.400000
      4
                                             6
                                                                        13.000000
         Unemployment rate Inflation rate
                                               GDP
                                                    Target
      0
                       10.8
                                        1.4 1.74
                                                      True
                       13.9
                                       -0.3 0.79
                                                     False
      1
      2
                                                      True
                       10.8
                                        1.4 1.74
      3
                       9.4
                                       -0.8 -3.12
                                                     False
      4
                       13.9
                                       -0.3 0.79
                                                     False
      [5 rows x 25 columns]
[73]: df.corr()["Target"]
                                                  0.100479
```

[73]: Marital status Application mode 0.233888 Application order -0.094355 Course -0.006814 Daytime/evening attendance -0.084496 Previous qualification 0.102795 Mother's qualification 0.048459 Father's qualification 0.003850 Mother's occupation -0.064195 Father's occupation -0.073238 Displaced -0.126113 Educational special needs 0.007254 Debtor 0.267207 Tuition fees up to date -0.442138 Gender 0.251955 Scholarship holder -0.313018 Age at enrollment 0.267229 Curricular units 2nd sem (enrolled) -0.182897 Curricular units 2nd sem (evaluations) -0.119239 Curricular units 2nd sem (approved) -0.653995 Curricular units 2nd sem (grade) -0.605350 Unemployment rate -0.004198 Inflation rate 0.030326 GDP -0.050260

```
Name: Target, dtype: float64
     0.0.2 Logistic regression
[75]: X = df.drop(columns="Target", axis=1)
      y = df["Target"]
[76]: X.shape
[76]: (3630, 24)
[77]: print("X: ", type(X))
      print("y: ", type(y))
     X: <class 'pandas.core.frame.DataFrame'>
     y: <class 'pandas.core.series.Series'>
 []: # Step 1: Import necessary libraries
      import pandas as pd
      from sklearn.model selection import train test split
      from sklearn.linear_model import LogisticRegression
      from sklearn.metrics import accuracy score, confusion matrix,
      →classification_report
      # Step 2: Load and preprocess the data
      # Assuming df is your DataFrame and 'Target' is the column you want to predict
      # Replace 'feature1', 'feature2', ... with actual feature column names
      X = df[["feature1", "feature2", "feature3"]] # Features
      y = df["Target"] # Target variable
      # Step 3: Split the data into training and testing sets
      X_train, X_test, y_train, y_test = train_test_split(
         X, y, test_size=0.2, random_state=42
      )
      # Step 4: Train the logistic regression model
      model = LogisticRegression()
      model.fit(X_train, y_train)
      # Step 5: Evaluate the model
      y_pred = model.predict(X_test)
      # Calculate accuracy
      accuracy = accuracy_score(y_test, y_pred)
      print(f"Accuracy: {accuracy:.2f}")
      # Confusion matrix
```

1.000000

Target

```
conf_matrix = confusion_matrix(y_test, y_pred)
print("Confusion Matrix:")
print(conf_matrix)

# Classification report
class_report = classification_report(y_test, y_pred)
print("Classification Report:")
print(class_report)
```

[]: