IEEE student EDA

June 10, 2024

```
[]: import pandas as pd
     import matplotlib.pyplot as plt
     import seaborn as sns
[]: # Load the datasets
     df1 = pd.read_csv('data/student/engagement/Student Engagement Level-Multiclass.
     df2 = pd.read_csv('data/student/performance/Student Performance_
      ⇔Prediction-Multi.csv')
     merged df = pd.merge(df1, df2, on='Student ID')
     # Convert binary indicator variables to categorical data type
     binary_indicators = ['Assignment 1 lateness indicator', 'Assignment 2 lateness⊔
      →indicator', 'Assignment 3 lateness indicator']
     merged_df[binary_indicators] = merged_df[binary_indicators].astype('category')
[]: print(len(merged_df))
     print(merged_df.columns)
    Index(['Student ID', '# Logins', '# Content Reads', '# Forum Reads',
           '# Forum Posts', '# Quiz Reviews before submission',
           'Assignment 1 lateness indicator', 'Assignment 2 lateness indicator',
           'Assignment 3 lateness indicator',
           'Assignment 1 duration to submit (in hours)',
           'Assignment 2 duration to submit (in hours)',
           'Assignment 3 duration to submit (in hours)',
           'Average time to submit assignment (in hours)', 'Engagement Level',
           'Quiz01 [10]', 'Assignment01 [8]', 'Midterm Exam [20]',
           'Assignment02 [12]', 'Assignment03 [25]', 'Final Exam [35]',
           'Course Grade', 'Total [100]', 'Class'],
          dtype='object')
[]: print(merged_df.dtypes)
    Student ID
                                                       object
                                                        int64
    # Logins
    # Content Reads
                                                        int64
    # Forum Reads
                                                        int64
```

```
# Forum Posts
                                                     int64
# Quiz Reviews before submission
                                                     int64
Assignment 1 lateness indicator
                                                  category
Assignment 2 lateness indicator
                                                  category
Assignment 3 lateness indicator
                                                  category
Assignment 1 duration to submit (in hours)
                                                   float64
Assignment 2 duration to submit (in hours)
                                                   float64
Assignment 3 duration to submit (in hours)
                                                   float64
Average time to submit assignment (in hours)
                                                  float64
Engagement Level
                                                    object
Quiz01 [10]
                                                     int64
Assignment01 [8]
                                                     int64
Midterm Exam [20]
                                                     int64
Assignment02 [12]
                                                     int64
Assignment03 [25]
                                                     int64
Final Exam [35]
                                                     int64
Course Grade
                                                     int64
Total [100]
                                                     int64
Class
                                                    object
dtype: object
```

[]: # Check for missing values

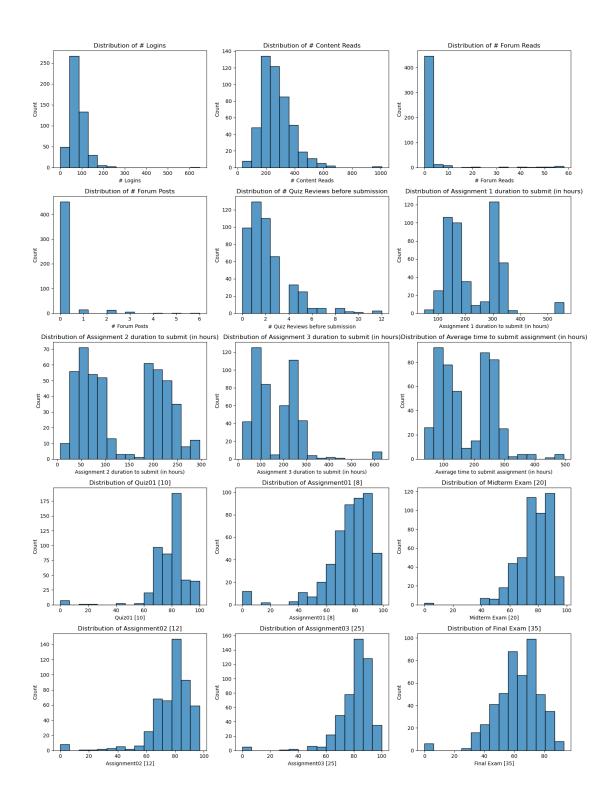
print(merged_df.isnull().sum())

```
0
Student ID
# Logins
                                                  0
# Content Reads
                                                  0
# Forum Reads
                                                  0
# Forum Posts
                                                  0
# Quiz Reviews before submission
                                                  0
Assignment 1 lateness indicator
                                                  0
Assignment 2 lateness indicator
                                                  0
Assignment 3 lateness indicator
                                                  0
Assignment 1 duration to submit (in hours)
                                                  0
Assignment 2 duration to submit (in hours)
                                                  0
Assignment 3 duration to submit (in hours)
                                                  0
Average time to submit assignment (in hours)
Engagement Level
                                                  0
Quiz01 [10]
                                                  0
Assignment01 [8]
                                                  0
Midterm Exam [20]
                                                  0
                                                  0
Assignment02 [12]
Assignment03 [25]
                                                  0
Final Exam [35]
                                                  0
Course Grade
                                                  0
Total [100]
                                                  0
Class
                                                  0
dtype: int64
```

```
[]: | # 'Course Grade' is the grade counted for a curve, we will use 'Total [100]'
     ⇔for this project
     numeric_features = ['# Logins', '# Content Reads', '# Forum Reads', '# Forum_
      ⇔Posts', '# Quiz Reviews before submission',
                         'Assignment 1 duration to submit (in hours)', 'Assignment 2

duration to submit (in hours)',
                         'Assignment 3 duration to submit (in hours)', 'Average time_
      ⇔to submit assignment (in hours)',
                         'Quiz01 [10]', 'Assignment01 [8]', 'Midterm Exam [20]',

¬'Assignment02 [12]',
                         'Assignment03 [25]', 'Final Exam [35]']
     full_numeric = numeric_features + ['Total [100]']
[]: # Distribution of numeric features
     fig, axes = plt.subplots(nrows=5, ncols=3, figsize=(15, 20))
     axes = axes.flatten()
     for i, feature in enumerate(numeric_features):
        sns.histplot(merged_df[feature], bins=15, ax=axes[i])
        axes[i].set_title(f'Distribution of {feature}')
     plt.tight_layout()
     plt.show()
```



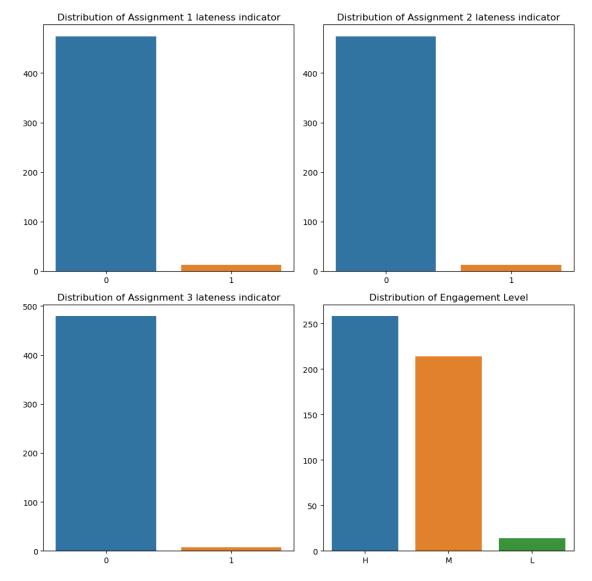
[]: # Distribution of categorical features
categorical_features = ['Assignment 1 lateness indicator', 'Assignment 2

⇔lateness indicator', 'Assignment 3 lateness indicator',

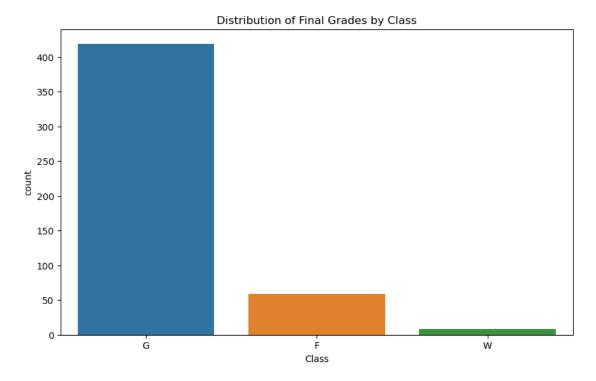
```
'Engagement Level']

fig, axes = plt.subplots(nrows=2, ncols=2, figsize=(10, 10))
axes = axes.flatten()
for i, feature in enumerate(categorical_features):
    sns.countplot(data=merged_df, x=feature, ax=axes[i])
    axes[i].set_title(f'Distribution of {feature}')
    axes[i].set_xlabel('')
    axes[i].set_ylabel('')

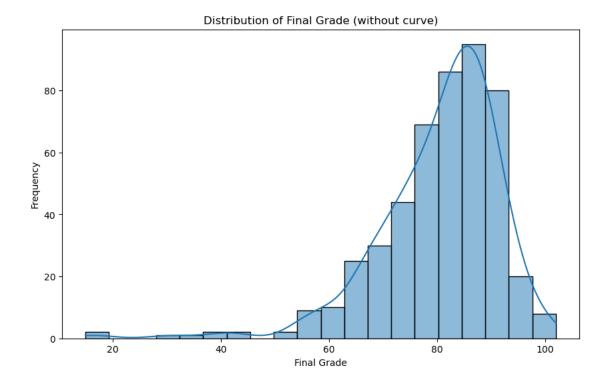
plt.tight_layout()
plt.show()
```



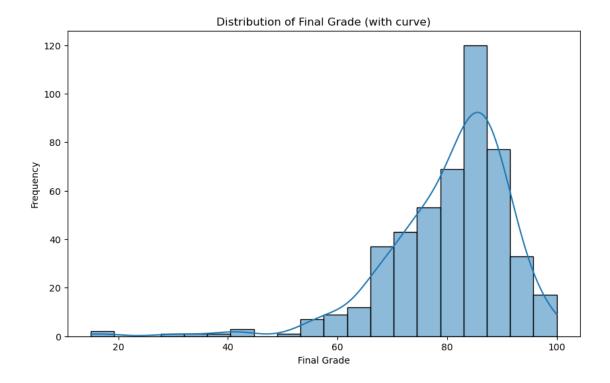
```
[]: # Distribution of final letter grades
plt.figure(figsize=(10, 6))
sns.countplot(x='Class', data=merged_df)
plt.title('Distribution of Final Letter Grades')
plt.show()
```



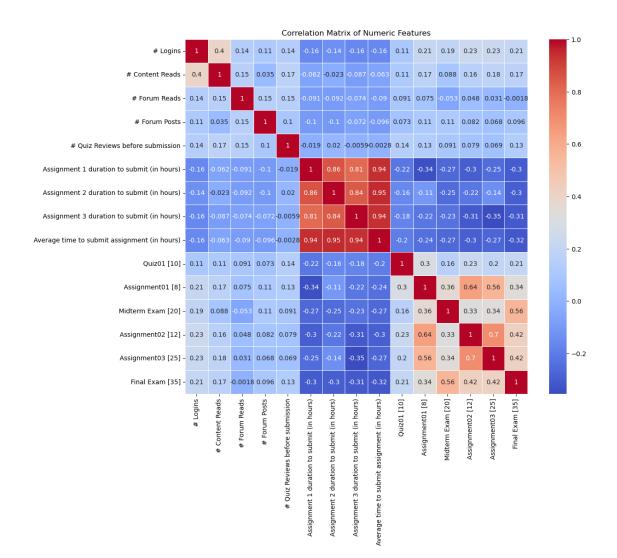
```
[]: # Final Grades distribution
plt.figure(figsize=(10, 6))
sns.histplot(merged_df['Total [100]'], bins=20, kde=True)
plt.title('Distribution of Final Grade (without curve)')
plt.xlabel('Final Grade')
plt.ylabel('Frequency')
plt.show()
```



```
[]: # Final Grades distribution
plt.figure(figsize=(10, 6))
sns.histplot(merged_df['Course Grade'], bins=20, kde=True)
plt.title('Distribution of Final Grade (with curve)')
plt.xlabel('Final Grade')
plt.ylabel('Frequency')
plt.show()
```



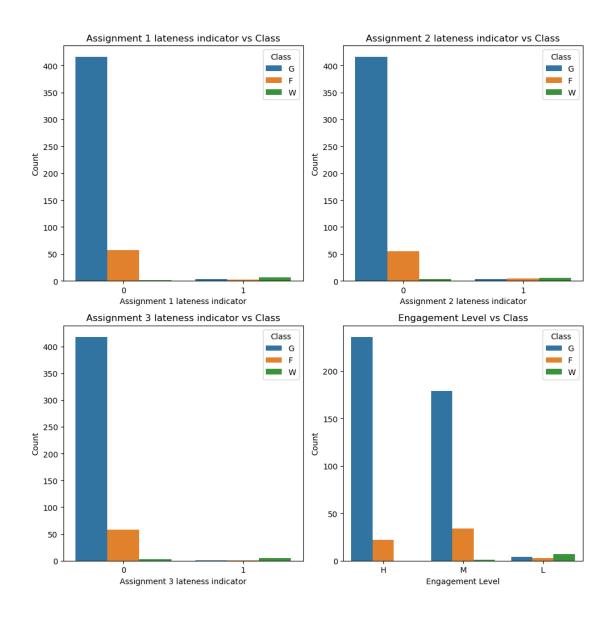
```
[]: # Correlation matrix for numerical features
plt.figure(figsize=(12, 10))
    correlation_matrix = merged_df[numeric_features].corr()
    sns.heatmap(correlation_matrix, annot=True, cmap='coolwarm', linewidths=0.5)
    plt.title('Correlation Matrix of Numeric Features')
    plt.show()
```



```
[]: # Count plots for final letter grade by categorical features
plt.figure(figsize=(10, 10))

for i, feature in enumerate(categorical_features):
    plt.subplot(2, 2, i+1)
    sns.countplot(x=feature, hue='Class', data=merged_df)
    plt.title(f'{feature} vs Class')
    plt.xlabel(feature)
    plt.ylabel('Count')

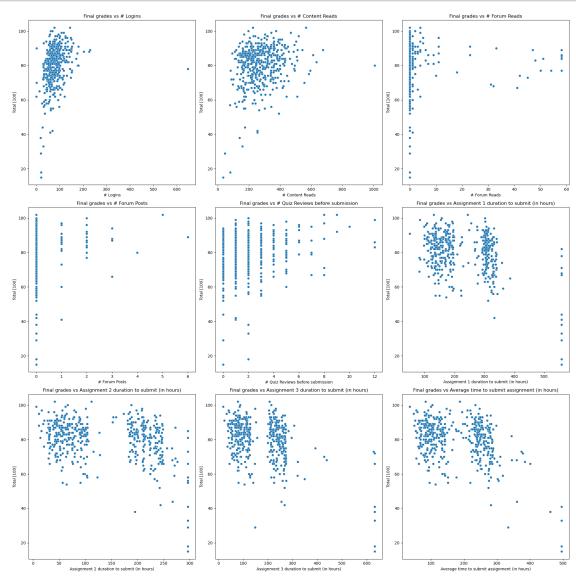
plt.tight_layout()
plt.show()
```



```
[]: # Scatter plots to show relationships between final grades and other numerical
\( \text{-variables} \)
engagement_metrics = ['# Logins', '# Content Reads', '# Forum Reads', '# Forum_\( \text{-variables} \)
\( \text{-Posts'}, '# Quiz Reviews before submission',
\( 'Assignment 1 duration to submit (in hours)', 'Assignment_\( \text{-variables} \)
\( \text{-2 duration to submit (in hours)',} \)
\( 'Assignment 3 duration to submit (in hours)', 'Average_\( \text{-variables} \)
\( \text{-time to submit assignment (in hours)'} \)

fig, axes = plt.subplots(nrows=3, ncols=3, figsize=(20, 20))
axes = axes.flatten()
for i, feature in enumerate(engagement_metrics):
```

```
sns.scatterplot(data=merged_df, x=feature, y='Total [100]', ax=axes[i])
axes[i].set_title(f'Final grades vs {feature}')
plt.tight_layout()
plt.show()
```



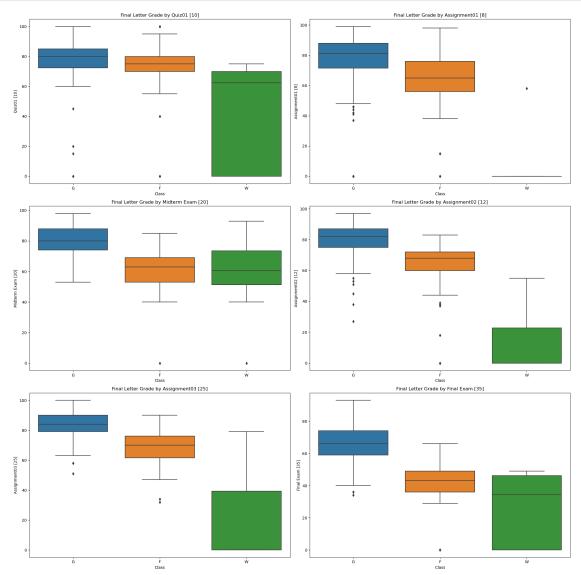
```
[]: # Box plots for quiz / assignment scores against final letter grade
assignment_metrics = ['Quiz01 [10]', 'Assignment01 [8]', 'Midterm Exam [20]',

→'Assignment02 [12]', 'Assignment03 [25]', 'Final Exam [35]']

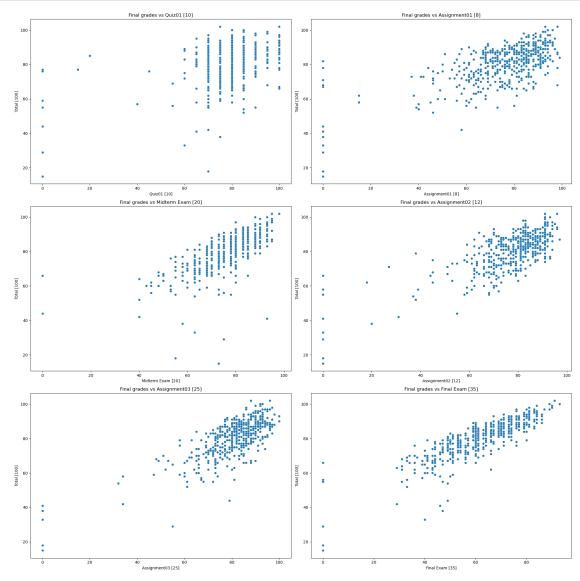
fig, axes = plt.subplots(nrows=3, ncols=2, figsize=(20, 20))
axes = axes.flatten()
for i, feature in enumerate(assignment_metrics):
```

```
sns.boxplot(data=merged_df, x='Class', y=feature, ax=axes[i])
axes[i].set_title(f'Final Letter Grade by {feature}')

plt.tight_layout()
plt.show()
```



```
axes = axes.flatten()
for i, feature in enumerate(assignment_metrics):
    sns.scatterplot(data=merged_df, x=feature, y='Total [100]', ax=axes[i])
    axes[i].set_title(f'Final grades vs {feature}')
plt.tight_layout()
plt.show()
```



```
[]: # Calculate correlation coefficients between final grade and other numerical

→ features

plt.figure(figsize=(10, 8))

sns.heatmap(merged_df[full_numeric].corr()[['Total [100]']].

→sort_values(by='Total [100]', ascending=False), annot=True, cmap='coolwarm')
```

plt.title('Correlation of Numerical Features with final grade') plt.show()

