```
In [607... import pandas as pd
         import numpy as np
         import seaborn as sns
         import matplotlib.pyplot as plt
         from sklearn.preprocessing import OneHotEncoder
         from sklearn.model selection import train test split
         from sklearn.ensemble import RandomForestRegressor
         from sklearn.metrics import mean absolute error as mae
         from sklearn.metrics import r2 score as r2
         from sklearn.model selection import cross val score
         from sklearn.preprocessing import LabelEncoder
In [608... student = pd.read csv("/home/kasagg21/Downloads/archive (2)/StudentsPerformance.csv")
         student.head()
Out[608...
            gender race/ethnicity parental level of education
                                                              lunch test preparation course math score reading score writing score
         0 female
                         group B
                                         bachelor's degree
                                                            standard
                                                                                                 72
                                                                                                              72
                                                                                                                          74
                                                                                    none
                                                                                                 69
                                                                                                              90
                                                                                                                          88
         1 female
                         group C
                                             some college
                                                            standard
                                                                                completed
                                                                                                 90
                                                                                                              95
                                                                                                                          93
         2 female
                         group B
                                          master's degree
                                                            standard
                                                                                    none
                                                                                                 47
                                                                                                              57
                                                                                                                          44
              male
                         group A
                                        associate's degree free/reduced
                                                                                    none
                                                                                                 76
                                                                                                              78
                                                                                                                          75
         4
              male
                         group C
                                             some college
                                                            standard
                                                                                    none
In [609... student.columns
Out[609... Index(['gender', 'race/ethnicity', 'parental level of education', 'lunch',
                 'test preparation course', 'math score', 'reading score',
                 'writing score'],
                dtype='object')
In [610... student.info()
        <class 'pandas.core.frame.DataFrame'>
        RangeIndex: 1000 entries, 0 to 999
        Data columns (total 8 columns):
             Column
                                           Non-Null Count Dtype
                                           -----
             -----
             gender
                                           1000 non-null object
             race/ethnicity
                                           1000 non-null object
             parental level of education 1000 non-null
         2
                                                          object
         3
             lunch
                                           1000 non-null object
             test preparation course
                                           1000 non-null object
             math score
                                          1000 non-null int64
             reading score
                                          1000 non-null
                                                         int64
                                          1000 non-null int64
             writing score
        dtypes: int64(3), object(5)
        memory usage: 62.6+ KB
In [611... student.isna().sum()
```

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Out[614...

```
Out[611... gender
         race/ethnicity
                                        0
         parental level of education
         lunch
         test preparation course
         math score
         reading score
                                        0
         writing score
         dtype: int64
In [612... student.select dtypes('object').nunique()
Out[612... gender
                                        2
         race/ethnicity
                                        5
         parental level of education
                                        6
         lunch
                                        2
         test preparation course
                                        2
         dtype: int64
In [613... print("Categories in 'gender' variable: ",end=" ")
         print(student['gender'].unique())
         print("Categories in 'race/ethnicity' variable: ",end=" ")
         print(student['race/ethnicity'].unique())
         print("Categories in 'parental level of education' variable: ",end=" ")
         print(student['parental level of education'].unique())
         print("Categories in 'lunch' variable: ",end=" ")
         print(student['lunch'].unique())
         print("Categories in 'test preparation course' variable: ",end=" ")
         print(student['test preparation course'].unique())
        Categories in 'gender' variable: ['female' 'male']
        Categories in 'race/ethnicity' variable: ['group B' 'group C' 'group A' 'group D' 'group E']
        Categories in 'parental level of education' variable: ["bachelor's degree" 'some college' "master's degree" "associate's degree"
         'high school' 'some high school']
        Categories in 'lunch' variable: ['standard' 'free/reduced']
        Categories in 'test preparation course' variable: ['none' 'completed']
In [614... student.describe()
```

	math score	reading score	writing score
count	1000.00000	1000.000000	1000.000000
mean	66.08900	69.169000	68.054000
std	15.16308	14.600192	15.195657
min	0.00000	17.000000	10.000000
25%	57.00000	59.000000	57.750000
50%	66.00000	70.000000	69.000000
75%	77.00000	79.000000	79.000000
max	100.00000	100.000000	100.000000

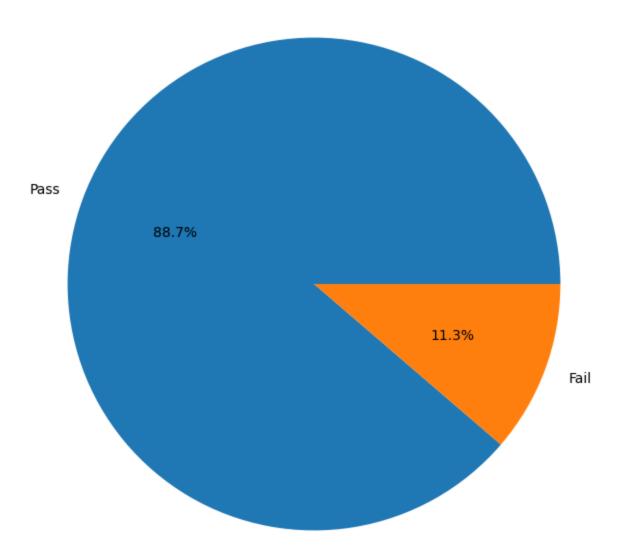
localhost:8888/lab 2/29

Out[620... Text(0.5, 1.0, 'Percentage of students Passed/Failed')

```
In [615... student['Total Score']=student['math score']+student['reading score']+student['writing score']
In [616... def result(TS,MS,WS,RS ):
             if(TS>150 and MS>40 and WS>40 and RS>40):
                  return 'P'
              else:
                  return 'F'
In [617... student['Pass/Fail']=student.apply(lambda x: result(x['Total Score'],x['math score'],x['writing score'],x['reading score']),axis = 1 )
In [618... student.head()
Out[618...
             gender race/ethnicity parental level of education
                                                                lunch test preparation course math score reading score writing score Total Score Pass/Fail
                                                                                                    72
                                                                                                                 72
                                                                                                                              74
                                                                                                                                         218
                                                                                                                                                   Ρ
          0 female
                          group B
                                          bachelor's degree
                                                              standard
                                                                                       none
                                                                                                                                                   Ρ
          1 female
                                                                                                    69
                                                                                                                 90
                                                                                                                              88
                                                                                                                                        247
                          group C
                                             some college
                                                              standard
                                                                                  completed
                                                                                                    90
          2 female
                          group B
                                           master's degree
                                                              standard
                                                                                                                 95
                                                                                                                              93
                                                                                                                                        278
                                                                                                                                                   Ρ
                                                                                       none
               male
                          group A
                                         associate's degree free/reduced
                                                                                                    47
                                                                                                                 57
                                                                                                                              44
                                                                                                                                        148
                                                                                       none
                                                                                                                                                   Ρ
                                                                                                    76
                                                                                                                 78
                                                                                                                              75
                                                                                                                                        229
          4
               male
                          group C
                                              some college
                                                              standard
                                                                                       none
In [619... student['Pass/Fail'].value counts()
Out[619... Pass/Fail
          Р
               887
          F 113
          Name: count, dtype: int64
In [620... plt.pie(student['Pass/Fail'].value counts(),labels=['Pass','Fail'],autopct='%1.1f%%')
         plt.title('Percentage of students Passed/Failed')
```

localhost:8888/lab 3/29

# Percentage of students Passed/Failed

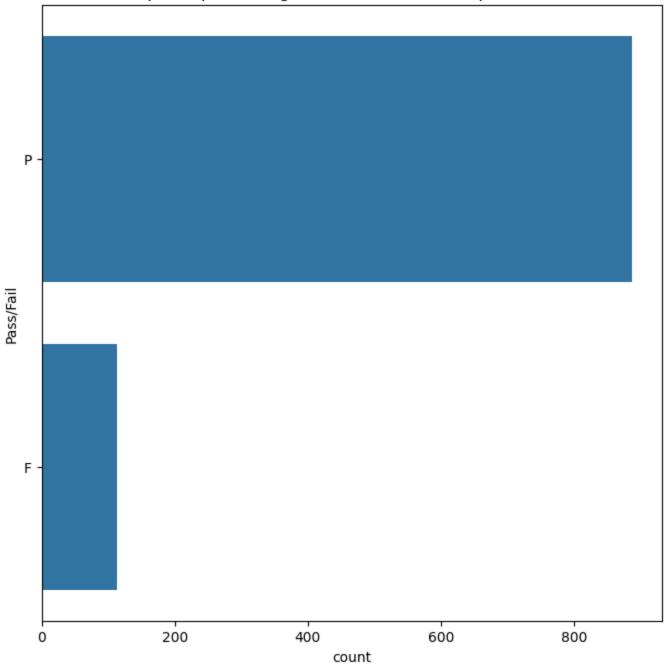


```
In [621... sns.countplot(student['Pass/Fail'])
   plt.title('Bar-plot representing the count of students passed/failed')
```

Out[621... Text(0.5, 1.0, 'Bar-plot representing the count of students passed/failed')

localhost:8888/lab 4/29

## Bar-plot representing the count of students passed/failed



localhost:8888/lab 5/29

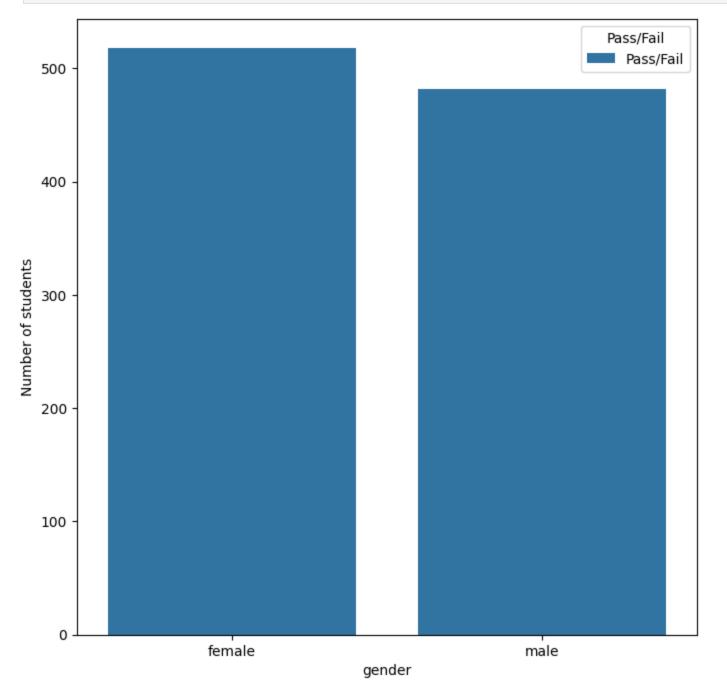
Percentage of female students passed: 90.73% Percentage of male students passed: 86.51%

```
import seaborn as sns
import matplotlib.pyplot as plt

melted_data = student.melt(id_vars="gender", value_vars="Pass/Fail")

sns.countplot(data=melted_data, x="gender", hue="Pass/Fail")

plt.ylabel("Number of students")
plt.show()
```

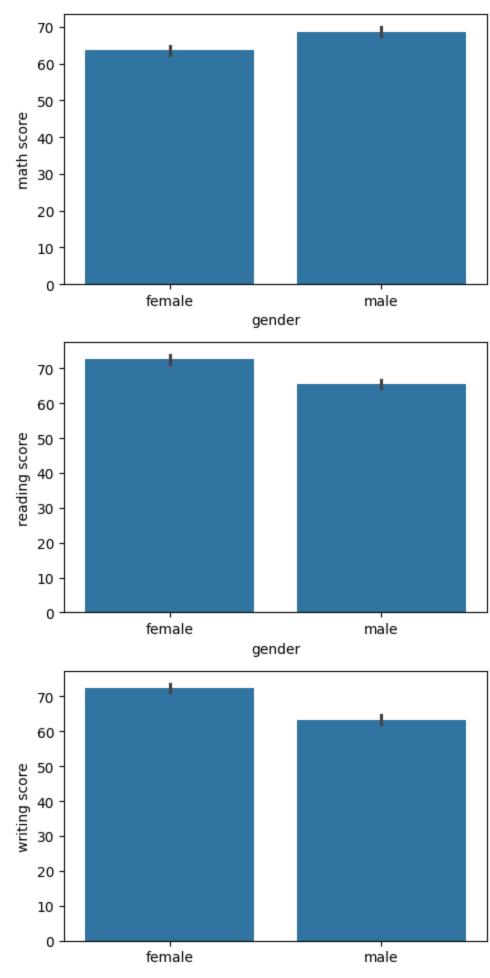


```
fig,ax = plt.subplots(3,1, figsize = (5,10))
sns.barplot(x=student['gender'],y=student['math score'], ax=ax[0], linewidth=2.5)
sns.barplot(x=student['gender'],y=student['reading score'], ax=ax[1],linewidth=2.5)
```

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sns.barplot(x=student['gender'],y=student['writing score'], ax=ax[2],linewidth=2.5)
plt.tight\_layout()

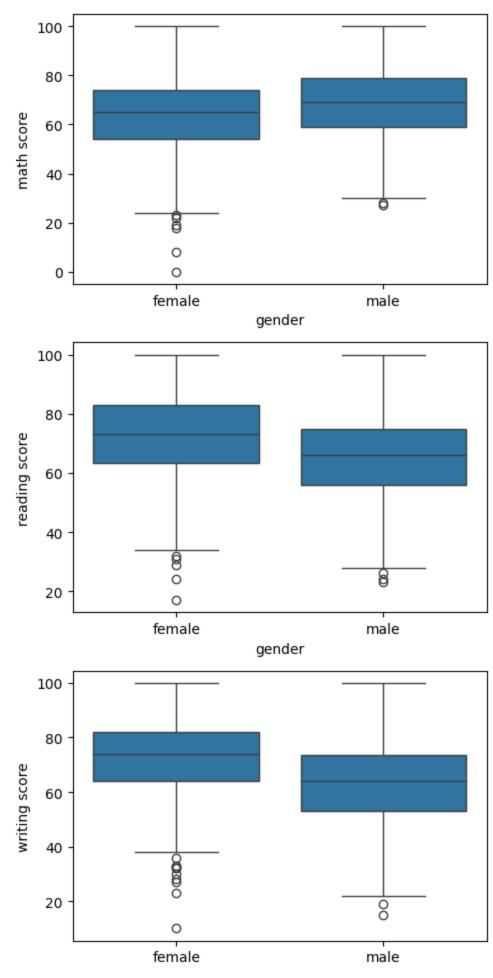
localhost:8888/lab 7/29



### gender

```
fig,ax = plt.subplots(3,1, figsize = (5,10))
sns.boxplot(x=student['gender'],y=student['math score'],ax=ax[0])
sns.boxplot(x=student['gender'],y=student['reading score'],ax=ax[1])
sns.boxplot(x=student['gender'],y=student['writing score'],ax=ax[2])
plt.tight_layout()
```

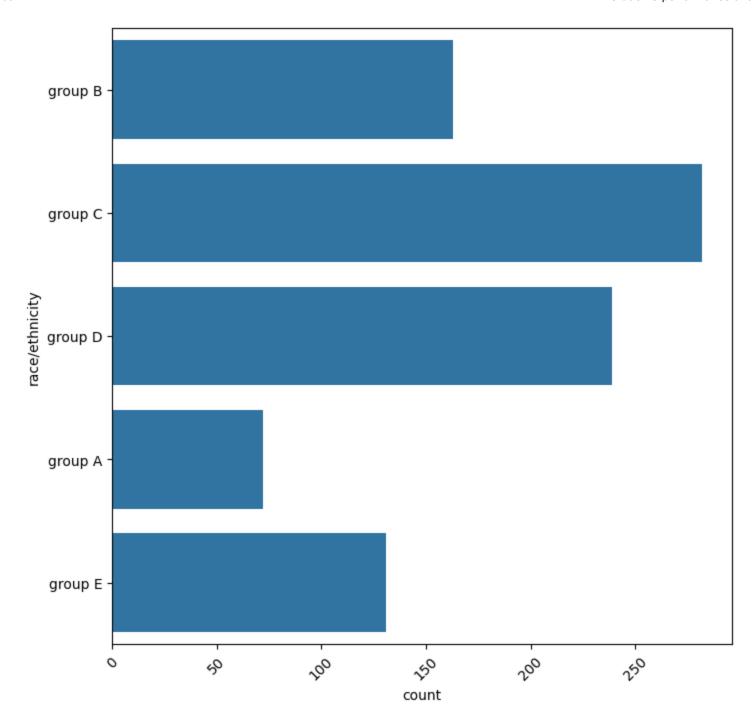
localhost:8888/lab 9/29



#### gender

```
In [627... student['race/ethnicity'].value counts()
Out[627... race/ethnicity
         group C
                   319
                    262
         group D
                   190
         group B
         group E 140
                    89
         group A
         Name: count, dtype: int64
In [628... print("The number of students passed across various race/ethnic group : ")
        print(student['race/ethnicity'].loc[student['Pass/Fail']=='P'].value counts())
        sns.countplot(student['race/ethnicity'].loc[student['Pass/Fail']=='P'])
        plt.xticks(rotation = 45)
        The number of students passed across various race/ethnic group :
        race/ethnicity
        group C
                  282
        group D
                  239
        group B 163
        group E 131
        group A
                  72
        Name: count, dtype: int64
Out[628... (array([ 0., 50., 100., 150., 200., 250., 300.]),
          [Text(0.0, 0, '0'),
           Text(50.0, 0, '50'),
           Text(100.0, 0, '100'),
           Text(150.0, 0, '150'),
           Text(200.0, 0, '200'),
           Text(250.0, 0, '250'),
           Text(300.0, 0, '300')])
```

localhost:8888/lab 11/29

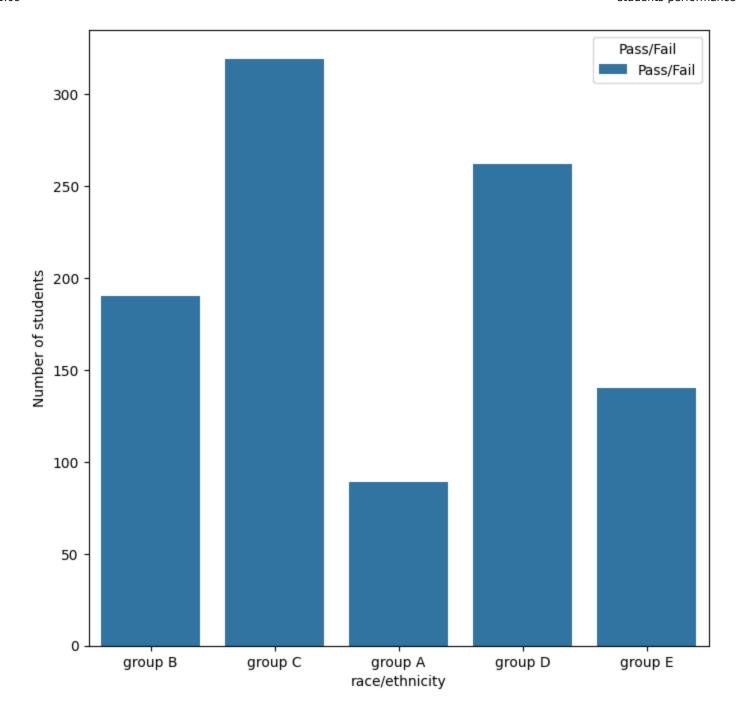


```
import seaborn as sns
import matplotlib.pyplot as plt

melted_data = student.melt(id_vars="race/ethnicity", value_vars="Pass/Fail", var_name="Pass/Fail")

sns.countplot(data=melted_data, x="race/ethnicity", hue="Pass/Fail")
plt.ylabel("Number of students")
plt.show()
```

localhost:8888/lab 12/29

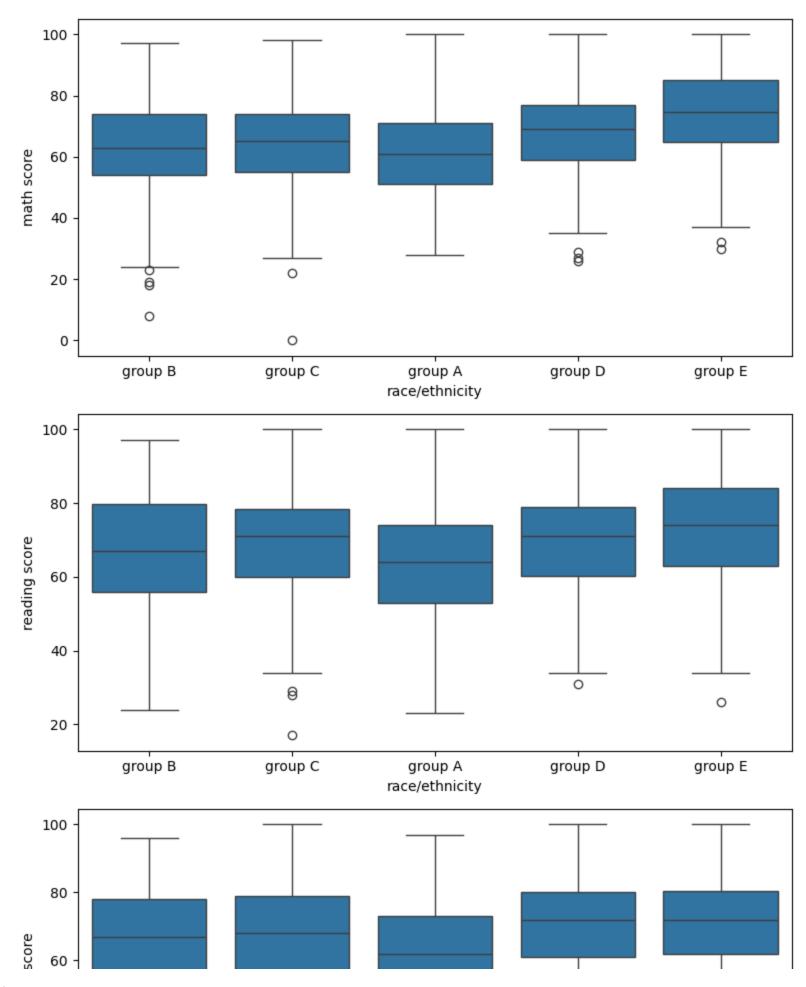


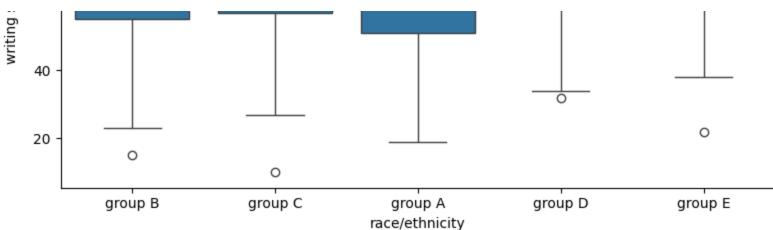
localhost:8888/lab 13/29

```
Percentage of students passed with the race/ethnicity as 'group A': 80.90%
Percentage of students passed with the race/ethnicity as 'group B': 85.79%
Percentage of students passed with the race/ethnicity as 'group C': 88.40%
Percentage of students passed with the race/ethnicity as 'group D': 91.22%
Percentage of students passed with the race/ethnicity as 'group E': 93.57%

In [631... fig. ax = plt.subplots(3,1, figsize=(8,12))
sns.boxplot(x=student['race/ethnicity'],y=student['math score'],ax=ax[0])
sns.boxplot(x=student['race/ethnicity'],y=student['reading score'],ax=ax[1])
sns.boxplot(x=student['race/ethnicity'],y=student['writing score'],ax=ax[2])
plt.tight_layout()
```

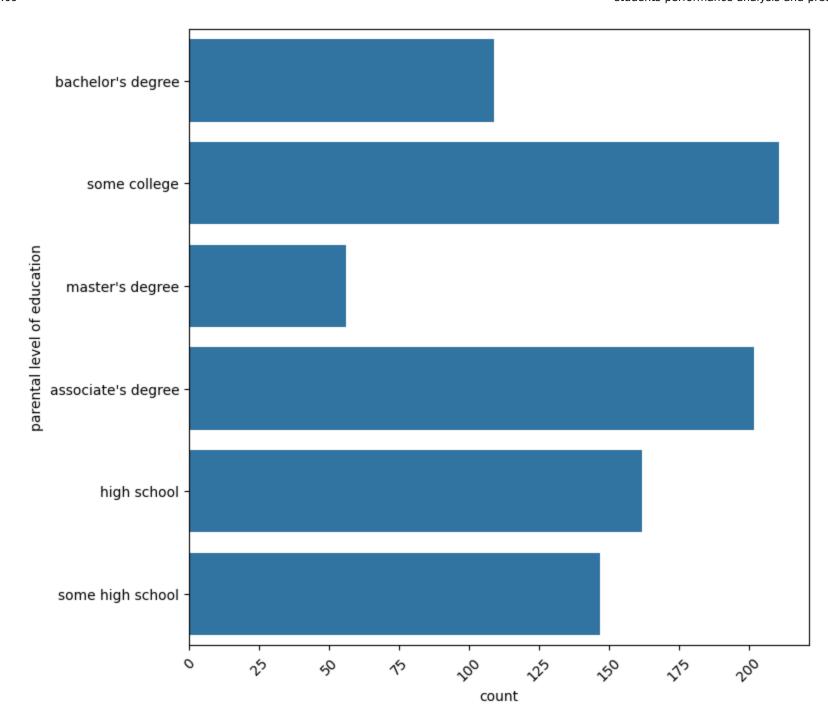
localhost:8888/lab 14/29





```
In [632... student['parental level of education'].value counts()
Out[632... parental level of education
         some college
         associate's degree
                               222
                                196
         high school
         some high school
                               179
                               118
         bachelor's degree
         master's degree
                                59
         Name: count, dtype: int64
In [633... #number of students passed across the parental levels of education
         print("The number of students passed across the different parental levels of education: ")
         print(student['parental level of education'].loc[student['Pass/Fail']=='P'].value counts())
         sns.countplot(student['parental level of education'].loc[student['Pass/Fail']=='P'])
         plt.xticks(rotation = 45)
        The number of students passed across the different parental levels of education:
        parental level of education
        some college
                              211
        associate's degree
                              202
        high school
                              162
                              147
        some high school
        bachelor's degree
                              109
        master's degree
                               56
        Name: count, dtype: int64
Out[633... (array([ 0., 25., 50., 75., 100., 125., 150., 175., 200., 225.]),
           [Text(0.0, 0, '0'),
           Text(25.0, 0, '25'),
           Text(50.0, 0, '50'),
            Text(75.0, 0, '75'),
            Text(100.0, 0, '100'),
            Text(125.0, 0, '125'),
            Text(150.0, 0, '150'),
            Text(175.0, 0, '175'),
            Text(200.0, 0, '200'),
            Text(225.0, 0, '225')])
```

localhost:8888/lab 16/29



localhost:8888/lab 17/29

```
print("Percentage of students passed with the parental level of education as 'master's degree': {0:.2f}%"
    .format((student['parental level of education']=="master's degree") & (student['Pass/Fail']=='P')].shape[0]/student[student['parental level of education']=="master's degree") & (student['Pass/Fail']=='P')].shape[0]/student[student['parental level of education']=="master's degree': 93.36%

Percentage of students passed with the parental level of education as 'some college': 93.36%

Percentage of students passed with the parental level of education as 'some high school': 82.65%

Percentage of students passed with the parental level of education as 'some high school': 82.12%

Percentage of students passed with the parental level of education as 'bachelor's degree': 92.37%

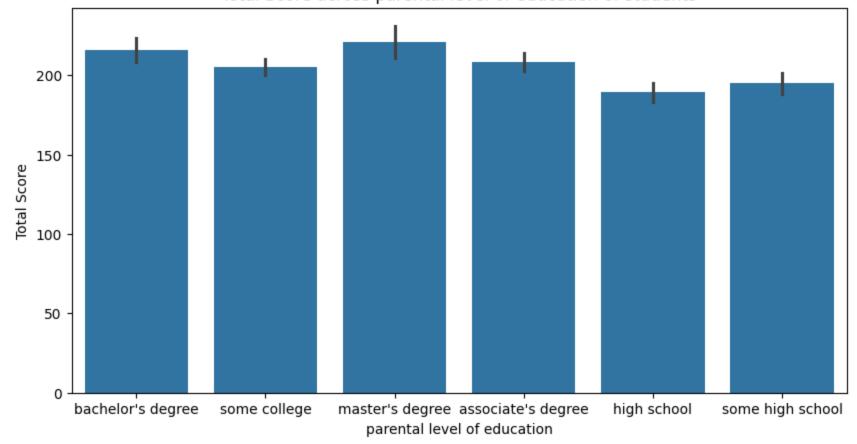
Percentage of students passed with the parental level of education as 'master's degree': 94.92%

In [635... plt.figure(figsize=(10,5))

plt.title("Total Score across parental level of education'],y=student['Total Score'])
```

Out[635... <Axes: title={'center': 'Total Score across parental level of education of students'}, xlabel='parental level of education', ylabel='Total Score'>

## Total Score across parental level of education of students



student['lunch'].value counts()

```
Out[636... lunch standard 645 free/reduced 355 Name: count, dtype: int64

In [637... student['lunch'].loc[student['Pass/Fail']=='P'].value_counts()
```

localhost:8888/lab 18/29

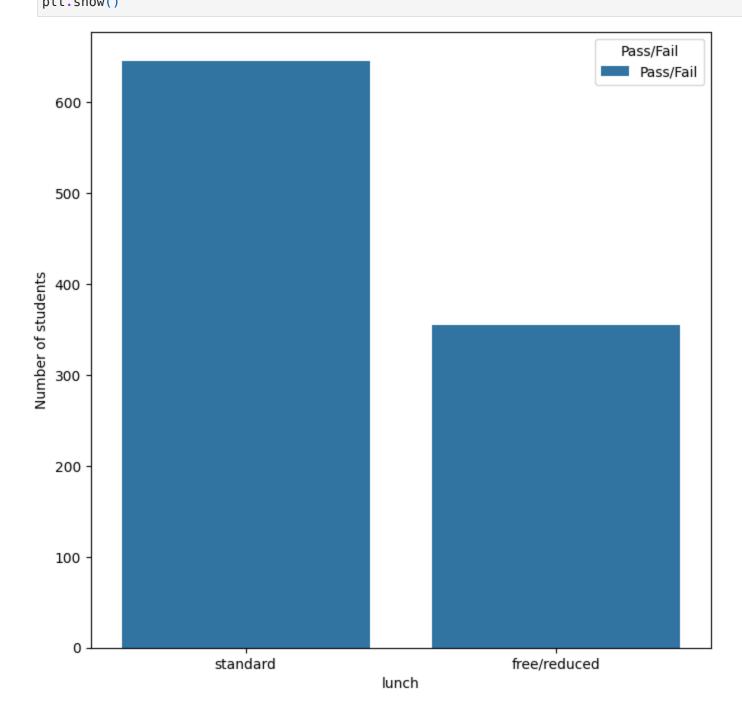
```
Out[637... lunch
standard 599
free/reduced 288
Name: count, dtype: int64
```

import seaborn as sns
import matplotlib.pyplot as plt
import pandas as pd

melted\_data = pd.melt(student, id\_vars="lunch", value\_vars="Pass/Fail", var\_name="Pass/Fail")

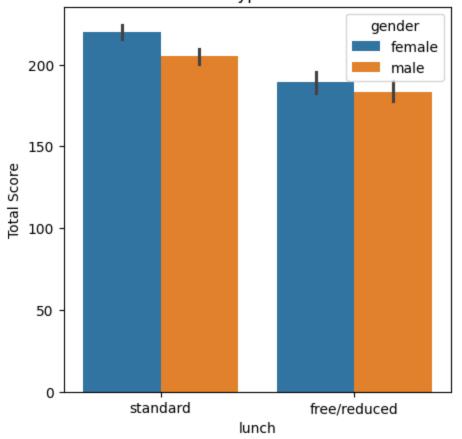
sns.countplot(data=melted\_data, x="lunch", hue="Pass/Fail")

plt.ylabel("Number of students")
plt.show()



localhost:8888/lab 19/29

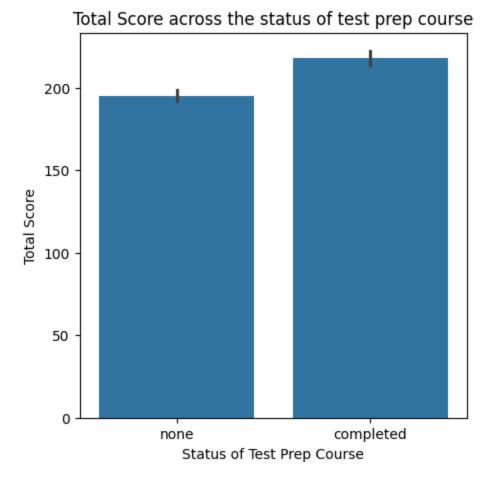
## Total Score across the type of lunch of the students



localhost:8888/lab 20/29

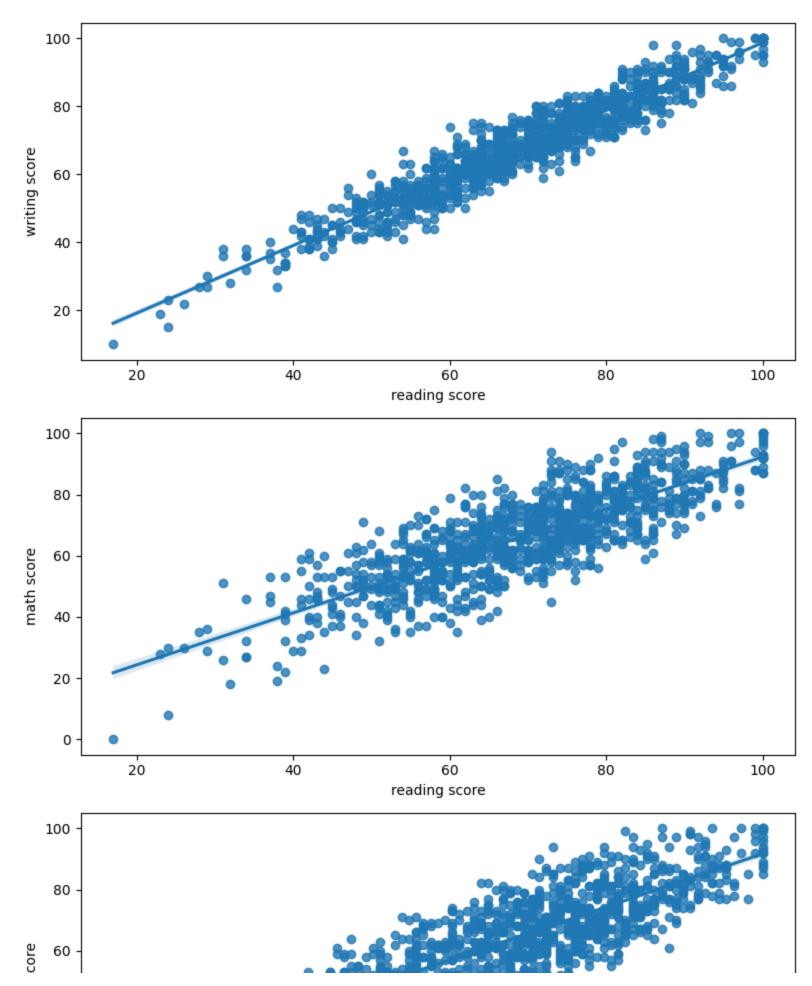
```
The number of students passed across the status of completion of the test preparation course:
        test preparation course
                     550
        none
                    337
        completed
        Name: count, dtype: int64
In [643... print("Percentage of students passed with the test preparation course status as 'none': {0:.2f}%"
             .format((student['test preparation course']=='none') & (student['Pass/Fail']=='P')].shape[0]/student[student['test preparation course']=='none'].shape[0])*100))
         print("Percentage of students passed with the test preparation course status as 'completed': {0:.2f}%"
             .format((student['test preparation course']=="completed") & (student['Pass/Fail']=='P')].shape[0]/student['test preparation course']=="completed"].shape[0])*10
        Percentage of students passed with the test preparation course status as 'none': 85.67%
        Percentage of students passed with the test preparation course status as 'completed': 94.13%
In [644... plt.figure(figsize=(5,5))
         sns.barplot(x=student['test preparation course'],y=student['Total Score'])
         plt.title("Total Score across the status of test prep course")
         plt.xlabel('Status of Test Prep Course')
```

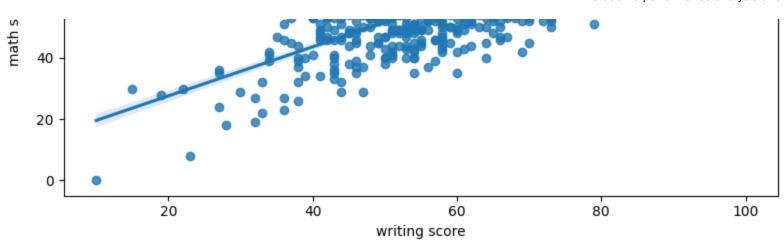
#### Out[644... Text(0.5, 0, 'Status of Test Prep Course')



```
fig, ax = plt.subplots(3,1, figsize=(8,12))
sns.regplot(x=student['reading score'],y=student['writing score'],ax = ax[0])
sns.regplot(x=student['reading score'],y=student['math score'],ax = ax[1])
sns.regplot(x=student['writing score'],y=student['math score'],ax=ax[2])
plt.tight_layout()
```

localhost:8888/lab 21/29





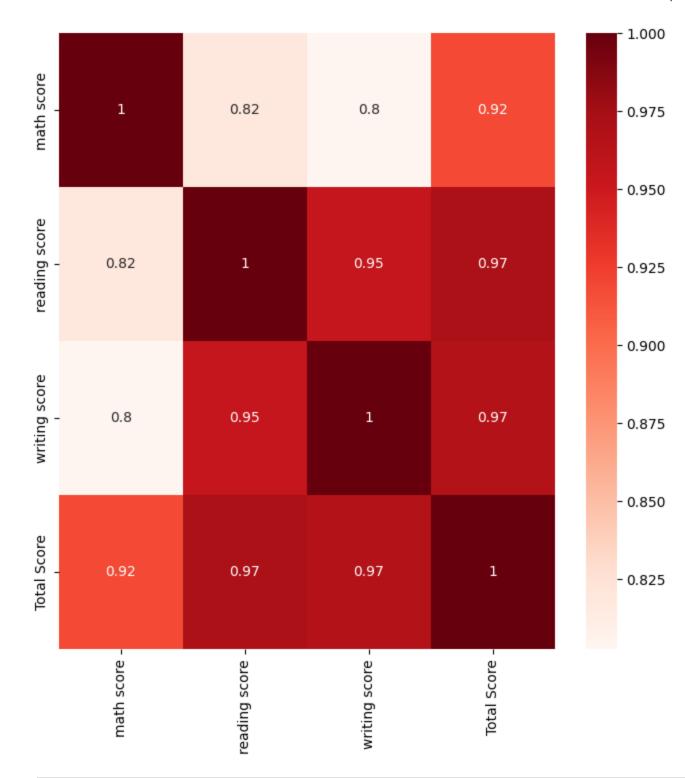
```
import seaborn as sns
import matplotlib.pyplot as plt

numeric_columns = student.select_dtypes(include='number')

correlation_matrix = numeric_columns.corr()

sns.heatmap(correlation_matrix, cmap="Reds", annot=True)
plt.xticks(rotation=90)
plt.show()
```

localhost:8888/lab 23/29



In [647... student.head()

```
Out[647...
          gender race/ethnicity parental level of education
                                                    lunch test preparation course math score reading score writing score Total Score Pass/Fail
        0 female
                                                                                 72
                                                                                            72
                                                                                                      74
                                                                                                               218
                                                                                                                        Ρ
                     group B
                                  bachelor's degree
                                                  standard
                                                                      none
        1 female
                                                  standard
                                                                                 69
                                                                                            90
                                                                                                      88
                                                                                                               247
                                                                                                                        Ρ
                     group C
                                     some college
                                                                   completed
                                                                                 90
                                                                                            95
                                                                                                      93
                                                                                                               278
                                                                                                                        Ρ
        2 female
                     group B
                                   master's degree
                                                  standard
                                                                      none
                                                                                 47
            male
                     group A
                                 associate's degree free/reduced
                                                                      none
                                                                                            57
                                                                                                      44
                                                                                                               148
                                                                                 76
                                                                                                                        Ρ
            male
                     group C
                                                                                            78
                                                                                                      75
                                                                                                               229
                                     some college
                                                  standard
                                                                      none
In [648... X=student[['gender','race/ethnicity','parental level of education','lunch','test preparation course']]
       X.head()
Out[648...
          gender race/ethnicity parental level of education
                                                    lunch test preparation course
        0 female
                     group B
                                  bachelor's degree
                                                  standard
                                                                      none
        1 female
                     group C
                                     some college
                                                  standard
                                                                   completed
        2 female
                     group B
                                   master's degree
                                                  standard
                                                                      none
            male
                     group A
                                  associate's degree free/reduced
                                                                      none
            male
                     group C
                                     some college
                                                  standard
                                                                      none
In [649... X category = student[['gender','race/ethnicity','parental level of education','lunch','test preparation course']]
       OH encoder = OneHotEncoder(handle unknown='ignore', sparse=False)
In [650...
In [651... X OH = pd.DataFrame(OH encoder.fit transform(X category))
        X 	ext{ OH.index} = X.index
        X OH.head()
       /home/kasagg21/.local/lib/python3.8/site-packages/sklearn/preprocessing/ encoders.py:975: FutureWarning: `sparse` was renamed to `sparse output` in version 1.2 and will be removed in
       n 1.4. `sparse output` is ignored unless you leave `sparse` to its default value.
        warnings.warn(
Out[651...
           0 1 2 3 4 5 6 7 8 9 10 11 12 13 14 15 16
        In [652... y=student['Pass/Fail']
       y.head()
```

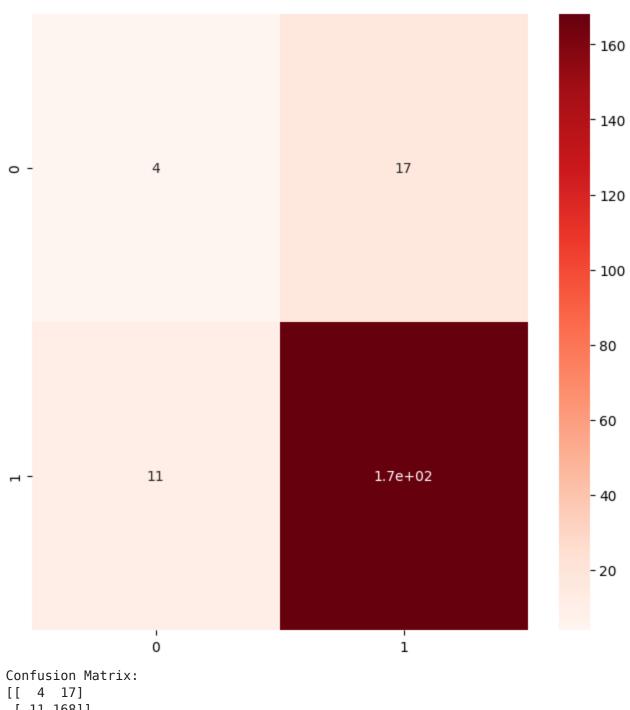
localhost:8888/lab 25/29

```
Out[652... 0
      1
      2
      3
         F
      4
         Ρ
      Name: Pass/Fail, dtype: object
In [653... lb=LabelEncoder()
      y=lb.fit transform(y)
In [654... X train, X valid, y train, y valid = train test split(X OH, y, train size=0.8, test size=0.2, random state=0)
In [655... model = RandomForestRegressor()
      model.fit(X train,y train)
Out[655...
      ▼ RandomForestRegressor
      RandomForestRegressor()
In [656... preds=model.predict(X valid)
In [657... preds= np.where(preds<0.4,0,1)</pre>
In [658... preds
1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 0, 1, 1, 1, 1, 1, 0, 1, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
          1, 0])
In [659... y_valid
1, 1, 1, 1, 1, 1, 0, 1, 0, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 0, 1, 1, 1, 1, 1, 1,
          1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1,
          1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 1, 0, 1, 1, 1, 1, 1, 1, 1, 1,
          1, 1])
In [660...
     mae(y valid,preds)
Out[660... 0.14
```

localhost:8888/lab 26/29

```
In [661... scores = -1 * cross val score(model, X OH, y,cv=5,scoring='neg mean absolute error')
         print("MAE scores:\n", scores)
        MAE scores:
         [0.18972894 0.20502389 0.18242712 0.18319758 0.18461936]
In [662... from sklearn.metrics import confusion matrix
         cm = confusion_matrix(y_valid, preds)
         plt.rcParams['figure.figsize'] = (8, 8)
         sns.heatmap(cm, annot = True, cmap = 'Reds')
         plt.show()
         # Calculate precision, recall, and F1 score
         precision = precision_score(y_valid, preds)
         recall = recall_score(y_valid, preds)
         f1 = f1_score(y_valid, preds)
         print(f"Confusion Matrix:\n{cm}")
         print(f"Precision: {precision}")
         print(f"Recall: {recall}")
         print(f"F1 Score: {f1}")
```

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```
[ 11 168]]
Precision: 0.9081081081081082
Recall: 0.9385474860335196
F1 Score: 0.9230769230769231
```

```
Accuracy: 86.00%
```

```
In [676... custom_data = {
    'gender': 'male',
```

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```
'race/ethnicity': 'group A',
'parental level of education': 'some high school',
'test preparation course': 'none'
}

In [677_ custom_data_df = pd.DataFrame([custom_data])
custom_data_encoded = pd.DataFrame(OH_encoder.transform(custom_data_df))
custom_data_encoded.index = custom_data_df.index

In [678_ predictions = model.predict(custom_data_encoded)

In [679_ pass_fail_prediction = 1 if predictions[0] >= 0.66 else 0

In [680_ print("Pass/Fail Prediction:", pass_fail_prediction)

Pass/Fail Prediction: 0

In [669_ import joblib
#model = RandomForestRegressor()
#joblib.dump(model, '/home/kasagg21/Downloads/archive (2)/trained_model_v3.joblib')
```

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