```
In [40]: import pandas as pd
          import numpy as np
          import seaborn as sns
          import matplotlib.pyplot as plt
          %matplotlib inline
          import warnings
          warnings.filterwarnings('ignore')
In [41]: # read the dataset
          df= pd.read_csv('D:\datasets\StudentsPerformance.csv')
In [42]: df.head()
Out[42]:
                                                                                                                        writing
                                          parental level of
                                                                            test preparation
                                                                                                math
                                                                                                           reading
             gender race/ethnicity
                                                               lunch
                                                education
                                                                                   course
                                                                                               score
                                                                                                             score
                                                                                                                         score
                                                                                                  72
                                                                                                                            74
            female
                          group B
                                          bachelor's degree
                                                             standard
                                                                                     none
                                                                                                               72
             female
                                              some college
                                                             standard
                                                                                 completed
                                                                                                  69
                                                                                                               90
                                                                                                                            88
                          group C
                                                                                                  90
                                                                                                               95
                                                                                                                            93
          2
             female
                          group B
                                           master's degree
                                                             standard
                                                                                     none
               male
                          group A
                                         associate's degree
                                                         free/reduced
                                                                                     none
                                                                                                  47
                                                                                                               57
                                                                                                                            44
               male
                          group C
                                                             standard
                                                                                                  76
                                                                                                               78
                                                                                                                            75
                                              some college
                                                                                     none
In [43]: ## check missing values
          df.isnull().sum()
                                            0
Out[43]: gender
          race/ethnicity
                                            0
                                            0
          parental level of education
                                            0
          lunch
                                            0
          test preparation course
          math score
                                            0
                                            0
          reading score
          writing score
                                            0
          dtype: int64
          Insights or Observation
          There are no missing values
In [44]: df.isna().sum()
Out[44]: gender
                                            0
          race/ethnicity
                                            0
          parental level of education
                                            0
          lunch
                                            0
          test preparation course
                                            0
          math score
                                            0
                                            0
          reading score
          writing score
                                            0
          dtype: int64
In [45]: ## check duplicates
          df.duplicated().sum()
Out[45]: 0
```

There are no duplicates values in the dataset

In [46]: ## check datatypes
df.info()

```
Data columns (total 8 columns):
         #
            Column
                                           Non-Null Count Dtype
                                            -----
         0
            gender
                                           1000 non-null object
                                                          object
             race/ethnicity
                                           1000 non-null
         1
             parental level of education
                                           1000 non-null
                                                           object
                                           1000 non-null
                                                            object
         4
            test preparation course
                                           1000 non-null
                                                            object
             math score
                                           1000 non-null
                                                            int64
         6
            reading score
                                           1000 non-null
                                                            int64
                                           1000 non-null
                                                            int64
            writina score
        dtypes: int64(3), object(5)
        memory usage: 62.6+ KB
In [47]: ## 3.1 Checking the number of uniques values of each columns
         df.nunique()
Out[47]: gender
                                           2
          race/ethnicity
                                           5
                                           6
          parental level of education
                                           2
                                           2
          test preparation course
          math score
                                          81
                                          72
          reading score
          writing score
                                          77
          dtype: int64
In [48]: ## Check the statistics of the datasets
         df.describe()
Out[48]:
                math score reading score writing score
         count 1000.00000
                            1000 000000
                                        1000.000000
                  66.08900
                              69.169000
                                          68.054000
          mean
                  15.16308
                              14.600192
                                          15.195657
            std
           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
```

#### Insights or oservation

<class 'pandas.core.frame.DataFrame'> RangeIndex: 1000 entries, 0 to 999

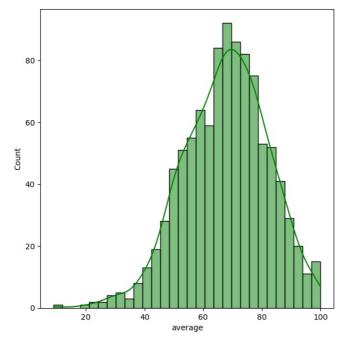
- From the above description of numerical data, all means are very close to each other between 66 and 69.
- All the standard deviation are also close between 14.6-15.19.
- While ther is a minimum of 0 for maths, others are having 17 and 10 value.

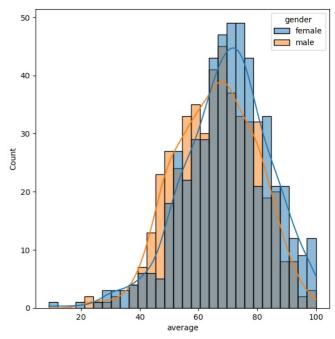
```
In [49]: [feature for feature in df.columns if df[feature].dtype=='0']
         ['gender',
Out[49]:
           'race/ethnicity',
           'parental level of education',
           'lunch',
           'test preparation course']
In [50]: # segrregate numerical and categorical features
         numerical_features=[feature for feature in df.columns if df[feature].dtype!='0']
         categorical feature=[feature for feature in df.columns if df[feature].dtype=='0']
In [51]: numerical_features
Out[51]: ['math score', 'reading score', 'writing score']
In [52]: categorical_feature
Out[52]: ['gender',
           'race/ethnicity',
           'parental level of education',
           'lunch',
           'test preparation course']
In [53]: df['gender'].value counts()
```

```
Out[53]: gender
          female
                    518
                    482
          male
          Name: count, dtype: int64
In [54]: df['race/ethnicity'].value_counts()
Out[54]: race/ethnicity
                     319
          group C
          group D
                     262
          group B
                     190
                     140
          group E
          group A
                      89
          Name: count, dtype: int64
In [55]: ## Aggregate the total score with the mean
         df['total score']=(df['math score']+df['reading score']+df['writing score'])
         df['average']=df['total score']/3
         df.head()
Out[55]:
```

parental level of reading writing test preparation math gender race/ethnicity lunch total\_score average education course score score score 74 72 218 72.666667 0 female bachelor's degree standard 72 group B none female some college standard completed 69 90 88 247 82.333333 1 group C 2 female group B master's degree standard none 90 95 93 278 92.666667 3 male group A associate's degree free/reduced none 47 57 44 148 49.333333 76 78 75 76.333333 male group C some college standard 229 none

```
In [59]: ### Explore More Visualization
fig,axis=plt.subplots(1,2,figsize=(15,7))
plt.subplot(121)
sns.histplot(data=df,x='average',bins=30,kde=True,color='g')
plt.subplot(122)
sns.histplot(data=df,x='average',bins=30,kde=True,hue='gender')
plt.show()
```

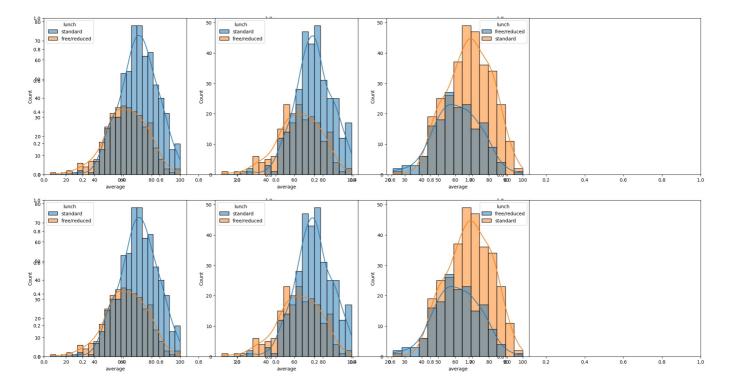




#### Insights

• Female student tend to perform well than male students

```
In [61]: plt.subplots(1,3,figsize=(25,6))
   plt.subplot(141)
   sns.histplot(data=df,x='average',kde=True,hue='lunch')
   plt.subplot(142)
   sns.histplot(data=df[df.gender=='female'],x='average',kde=True,hue='lunch')
   plt.subplot(143)
   sns.histplot(data=df[df.gender=='male'],x='average',kde=True,hue='lunch')
   plt.show()
```



### Insights

- Standard lunch help students perform well in exams
- Standard lunch helps perform well in exams be it a male of female

In [63]: df.head()

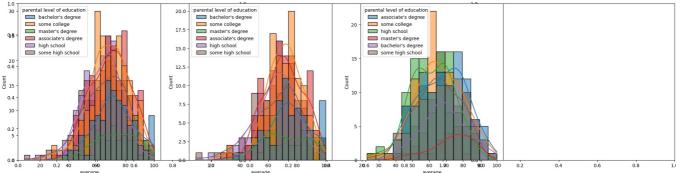
Out[63]:

	gender	race/ethnicity	parental level of education	lunch	test preparation course	math score	reading score	writing score	total_score	average
0	female	group B	bachelor's degree	standard	none	72	72	74	218	72.666667
1	female	group C	some college	standard	completed	69	90	88	247	82.333333
2	female	group B	master's degree	standard	none	90	95	93	278	92.666667
3	male	group A	associate's degree	free/reduced	none	47	57	44	148	49.333333
4	male	group C	some college	standard	none	76	78	75	229	76.333333

```
In [66]: plt.subplots(1,3,figsize=(25,6))
plt.subplot(141)
sns.histplot(data=df,x='average',kde=True,hue='parental level of education')
plt.subplot(142)
sns.histplot(data=df[df.gender=='female'],x='average',kde=True,hue='parental level of education')
plt.subplot(143)
sns.histplot(data=df[df.gender=='male'],x='average',kde=True,hue='parental level of education')
plt.show()

10
parental level of education
plt.show()

20.0
parental level of education
some college
some col
```



## Insights

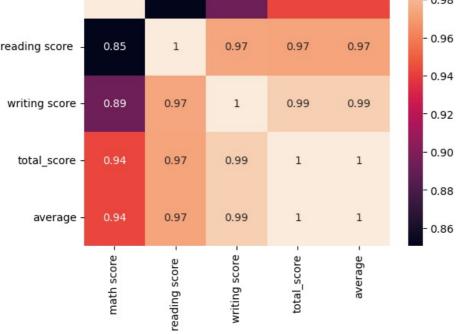
- In general parent's education don't help student perform well in exam
- 3rd plot shows that parent's whose education is of associate's degree or master's degree their male child tend to perform well in exam
- 2nd plot we can see there is no effect of parent's education on female students.

```
In [70]: plt.subplots(1,3,figsize=(25,6))
plt.subplot(141)
sns.histplot(data=df,x='average',kde=True,hue='race/ethnicity')
plt.subplot(142)
sns.histplot(data=df[df.gender=='female'],x='average',kde=True,hue='race/ethnicity')
plt.subplot(143)
sns.histplot(data=df[df.gender=='male'],x='average',kde=True,hue='race/ethnicity')
plt.show()
```

# Insights

- Students of group A and group B tends to perform poorly in exam
- Students of group A and group B tends to perform poorly in exam irrespective of whether they are male or female

```
In [97]:
          sns.heatmap(df.corr(), annot=True)
          plt.show()
                                                                                         - 1.00
                                        0.85
                                                               0.94
            math score -
                              1
                                                   0.89
                                                                          0.94
                                                                                         - 0.98
                                                                                         - 0.96
         reading score
                             0.85
                                          1
                                                   0.97
                                                               0.97
                                                                          0.97
                                                                                         - 0.94
```



In [ ]:

Loading [MathJax]/jax/output/CommonHTML/fonts/TeX/fontdata.js