

```
In [1]:
            import numpy as np
            import pandas as pd
 In [3]:
            data = pd.read_csv("StudentsPerformance.csv")
            data.head(10)
                                                                            test
 Out[3]:
                                      parental level of
                                                                                  math
                                                                                         reading
                                                                                                  writing
               gender race/ethnicity
                                                            lunch
                                                                     preparation
                                           education
                                                                                  score
                                                                                           score
                                                                                                   score
                                                                         course
                                                                                     72
                                                                                              72
                                                                                                      74
           0
               female
                             group B
                                      bachelor's degree
                                                          standard
                                                                           none
               female
                                                          standard
                                                                       completed
                                                                                     69
                                                                                              90
                                                                                                      88
           1
                             group C
                                         some college
           2
               female
                                       master's degree
                                                          standard
                                                                           none
                                                                                     90
                                                                                              95
                                                                                                      93
                             group B
                                           associate's
           3
                 male
                                                       free/reduced
                                                                           none
                                                                                     47
                                                                                              57
                                                                                                      44
                             group A
                                               degree
           4
                                                                                     76
                                                                                              78
                                                                                                      75
                 male
                             group C
                                         some college
                                                          standard
                                                                           none
                                           associate's
           5
               female
                             group B
                                                          standard
                                                                           none
                                                                                     71
                                                                                              83
                                                                                                      78
                                               degree
                                                                       completed
                                                                                     88
                                                                                              95
                                                                                                      92
           6
               female
                             group B
                                         some college
                                                          standard
           7
                 male
                                         some college
                                                       free/reduced
                                                                                     40
                                                                                              43
                                                                                                      39
                             group B
                                                                           none
           8
                 male
                             group D
                                           high school
                                                       free/reduced
                                                                       completed
                                                                                     64
                                                                                              64
                                                                                                      67
           9
               female
                             group B
                                           high school
                                                       free/reduced
                                                                           none
                                                                                     38
                                                                                              60
                                                                                                      50
 In [8]:
            data.info()
           <class 'pandas.core.frame.DataFrame'>
           RangeIndex: 1000 entries, 0 to 999
           Data columns (total 8 columns):
            #
                 Column
                                                      Non-Null Count
                                                                         Dtype
            - - -
            0
                  gender
                                                      1000 non-null
                                                                          object
             1
                  race/ethnicity
                                                      1000 non-null
                                                                          object
             2
                  parental level of education
                                                      1000 non-null
                                                                          object
             3
                                                      1000 non-null
                  lunch
                                                                          object
             4
                                                      1000 non-null
                 test preparation course
                                                                          object
             5
                 math score
                                                      1000 non-null
                                                                          int64
             6
                                                      1000 non-null
                  reading score
                                                                          int64
             7
                                                      1000 non-null
                                                                          int64
                 writing score
           dtypes: int64(3), object(5)
           memory usage: 62.6+ KB
In [35]:
            df.describe()
Out[35]:
                                               parental
                                                                            test
                                                                                                reading
                                                                                      math
                     gender race/ethnicity
                                               level of
                                                                    preparation
                                                             lunch
                                                                                                  score
                                                                                      score
                                             education
                                                                         course
           count 984.00000
                                984.000000
                                            984.000000
                                                        984.000000
                                                                     984.000000
                                                                                 984.000000
                                                                                             984.000000
                                                                                                         984
                     0.48374
                                  1.855691
                                                                       0.362805
                                                                                  66.775407
            mean
                                              2.675813
                                                          0.347561
                                                                                              69.795732
                                                                                                          68
              std
                     0.49999
                                  1.368706
                                              1.685189
                                                          0.476438
                                                                       0.481054
                                                                                  14.243035
                                                                                              13.831126
                                                                                                          14
                     0.00000
                                  0.000000
                                              0.000000
                                                          0.000000
                                                                       0.000000
                                                                                  29.000000
                                                                                              31.000000
                                                                                                          33
             min
             25%
                     0.00000
                                  1.000000
                                              1.000000
                                                          0.000000
                                                                       0.000000
                                                                                  57.000000
                                                                                              60.000000
                                                                                                          58
```

50%

**75**%

0.00000

1.00000

1.000000

3.000000

3.000000

4.000000

0.000000

1.000000

0.000000

1.000000

67.000000

77.000000

70.000000

80.000000

69

79

max 1.00000 4.000000 5.000000 1.000000 1.000000 100.000000 100.000000 100

No null values are present in the dataset

dtypes: int64(3), object(5)
memory usage: 62.6+ KB

```
In [5]:
           data.isnull().sum()
          gender
                                            0
 Out[5]:
          race/ethnicity
                                            0
          parental level of education
                                            0
          test preparation course
                                            0
          math score
                                            0
          reading score
                                            0
                                            0
          writing score
          dtype: int64
 In [9]:
           data_col = data.columns
           for i in data col[:len(data col)-3]:
               print("Unique data elements for "+str(i)+" : "+str(data[i].unique()))
          Unique data elements for gender : ['female' 'male']
          Unique data elements for race/ethnicity : ['group B' 'group C' 'group A' 'gro
          up D' 'group E']
          Unique data elements for parental level of education : ["bachelor's degree"
          'some college' "master's degree" "associate's degree"
           'high school' 'some high school']
          Unique data elements for lunch : ['standard' 'free/reduced']
          Unique data elements for test preparation course : ['none' 'completed']
In [11]:
           df = data.copy()
           df.head()
                                                                   test
Out[11]:
                                  parental level of
                                                                         math reading
                                                                                      writing
             gender race/ethnicity
                                                     lunch
                                                             preparation
                                       education
                                                                        score
                                                                                score
                                                                                        score
                                                                 course
          0
             female
                         group B
                                 bachelor's degree
                                                   standard
                                                                  none
                                                                           72
                                                                                   72
                                                                                          74
             female
                                                              completed
                                                                           69
                                                                                   90
                                                                                          88
          1
                         group C
                                    some college
                                                   standard
          2
             female
                         group B
                                  master's degree
                                                   standard
                                                                  none
                                                                           90
                                                                                   95
                                                                                          93
                                      associate's
          3
                                                free/reduced
                                                                                   57
                                                                                          44
               male
                         group A
                                                                  none
                                                                           47
                                         degree
                                                                                   78
                                                                                          75
               male
                         group C
                                    some college
                                                   standard
                                                                  none
                                                                           76
In [12]:
           df.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 1000 entries, 0 to 999
          Data columns (total 8 columns):
           #
               Column
                                               Non-Null Count Dtype
                                                1000 non-null
                                                                 object
           0
               gender
           1
               race/ethnicity
                                                1000 non-null
                                                                 object
               parental level of education
           2
                                              1000 non-null
                                                                 object
           3
                                                1000 non-null
                                                                 object
           4
               test preparation course
                                               1000 non-null
                                                                 object
           5
               math score
                                               1000 non-null
                                                                 int64
           6
                                               1000 non-null
                                                                 int64
               reading score
           7
               writing score
                                               1000 non-null
                                                                 int64
```

## filling missing values

## Catogorical data into numeric data

```
In [16]:
    cat_cols = df.select_dtypes(['object']).columns

# output of factorize() is [labels, uniques] and we need labels.
    df[cat_cols] = df[cat_cols].apply(lambda x:pd.factorize(x)[0])
```

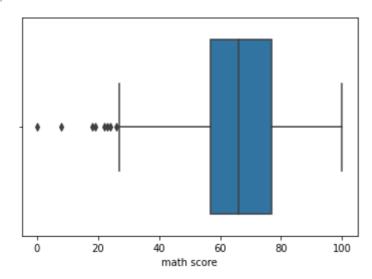
```
In [17]: df.head()
```

Out[17]:		gender	race/ethnicity	parental level of education	lunch	test preparation course	math score	reading score	writing score	
	0	0	0	0	0	0	72	72	74	
	1	0	1	1	0	1	69	90	88	
	2	0	0	2	0	0	90	95	93	
	3	1	2	3	1	0	47	57	44	
	4	1	1	1	0	0	76	78	75	

## Check for outliers

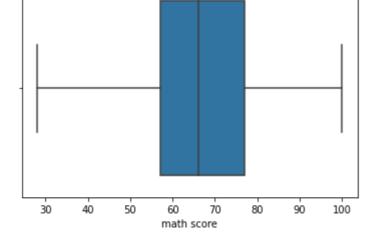
```
import seaborn as sns
sns.boxplot(x=df['math score'])
```

Out[18]: <AxesSubplot:xlabel='math score'>



In [19]: import seaborn as sns

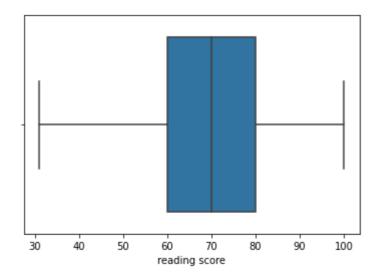
```
sns.boxplot(x=df['reading score'])
         <AxesSubplot:xlabel='reading score'>
Out[19]:
             20
                                 60
                                          80
                                                    100
                            reading score
In [20]:
          import seaborn as sns
          sns.boxplot(x=df['writing score'])
         <AxesSubplot:xlabel='writing score'>
Out[20]:
                20
                                                    100
                            writing score
In [25]:
          def outlierDetection (i,df):
              Q1 = np.percentile(df[i], 25)
              Q3 = np.percentile(df[i], 75)
              IQR = Q3 - Q1
              # Upper bound
              upper = np.where(df[i] >= (Q3+1.5*IQR))
              # Lower bound
              lower = np.where(df[i] \le (Q1-1.5*IQR))
               ''' Removing the Outliers '''
              df.drop(upper[0], axis=0, inplace = True)
              df.drop(lower[0], axis=0, inplace = True)
In [26]:
          outlierDetection('math score',df)
          df = df.reset index(drop=True)
In [27]:
          sns.boxplot(x=df['math score'])
         <AxesSubplot:xlabel='math score'>
Out[27]:
```



```
In [28]:     outlierDetection('reading score', df)
     df = df.reset_index(drop=True)
```

```
In [31]: sns.boxplot(x=df['reading score'])
```

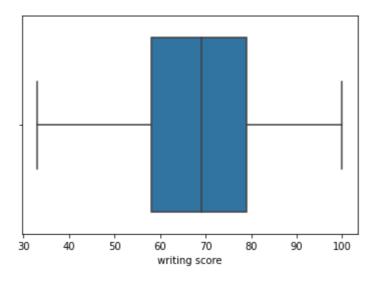
Out[31]: <AxesSubplot:xlabel='reading score'>



```
In [32]:    outlierDetection('writing score', df)
    df = df.reset_index(drop=True)
```

```
In [33]: sns.boxplot(x=df['writing score'])
```

Out[33]: <AxesSubplot:xlabel='writing score'>



Decision of entities were become

Reomoved outliers using poxplot

## Using MinMaxScaler to scale data from range 0 to 10

```
In [21]:
           df scaled = df.copy()
In [22]:
           col_names = ['math score', 'reading score', 'writing score']
           features= df_scaled[col_names]
In [23]:
           from sklearn.preprocessing import MinMaxScaler
           \# scaled = (x-min)/(max-min)
           scaler = MinMaxScaler(feature range=(0,10))
           df scaled[col names] = scaler.fit transform(features.values)
In [24]:
           df_scaled.head()
                                                               test
Out[24]:
                                  parental level of
                                                                     math
                                                                            reading
                                                                                     writing
             gender race/ethnicity
                                                lunch
                                                         preparation
                                      education
                                                                     score
                                                                             score
                                                                                      score
                                                            course
                                             0
          0
                 0
                              0
                                                   0
                                                                 0
                                                                       7.2 6.626506
                                                                                    7.111111
          1
                 0
                              1
                                             1
                                                   0
                                                                 1
                                                                       6.9 8.795181 8.666667
          2
                 0
                              0
                                             2
                                                                 0
                                                   0
                                                                       9.0 9.397590 9.222222
          3
                 1
                              2
                                             3
                                                   1
                                                                 0
                                                                       4.7 4.819277 3.777778
                                                   0
                                                                 0
                                                                       7.6 7.349398 7.222222
                 1
                              1
                                             1

 Data is scaled in 0 - 10

In [40]:
           from sklearn import preprocessing
           df1 = df
In [41]:
           Standardisation = preprocessing.StandardScaler()
In [43]:
           x_after_Standardisation = Standardisation.fit_transform(df1)
          Standardisation = (x - mean(x)) / standard_deviation
In [44]:
           print ("\nAfter Standardisation : \n", x_after_Standardisation)
          After Standardisation :
           [[-0.96799167 -1.3564894 -1.58864892 ... 0.36700396 0.15945117
             0.3680697 ]
           [-0.96799167 - 0.62550059 - 0.99494192 \dots 0.15626759 1.46152545
             1.34373415]
           [-0.96799167 -1.3564894 -0.40123492 ... 1.63142218 1.82321276
             1.69218573]
```