```
In [1]: import pandas as pd
 In [2]: import numpy as np
 In [3]: import matplotlib.pyplot as plt
 In [4]: import seaborn as sb
 In [6]: df = pd.read_csv("Boston.csv")
 In [7]: df
 Out[7]:
                CRIM
                        ZN INDUS CHAS
                                           NOX
                                                   RM AGE
                                                                DIS RAD
                                                                           TAX PTRATIO BLAC
            0 0.00632
                       18.0
                               2.31
                                        0 0.538 6.575
                                                        65.2 4.0900
                                                                       1 296.0
                                                                                     15.3
                                                                                           396.9
            1 0.02731
                               7.07
                                        0 0.469 6.421
                                                        78.9 4.9671
                                                                       2 242.0
                                                                                           396.9
                        0.0
                                                                                     17.8
            2 0.02729
                        0.0
                               7.07
                                        0 0.469 7.185 61.1 4.9671
                                                                       2 242.0
                                                                                     17.8
                                                                                           392.8
            3 0.03237
                        0.0
                               2.18
                                        0 0.458 6.998 45.8 6.0622
                                                                       3 222.0
                                                                                     18.7
                                                                                           394.6
            4 0.06905
                        0.0
                               2.18
                                        0 0.458 7.147 54.2 6.0622
                                                                       3 222.0
                                                                                     18.7
                                                                                           396.9
                        •••
          501 0.06263
                                        0 0.573 6.593 69.1 2.4786
                                                                                           391.9
                        0.0
                              11.93
                                                                       1 273.0
                                                                                     21.0
          502 0.04527
                              11.93
                                        0 0.573 6.120 76.7 2.2875
                                                                                           396.9
                        0.0
                                                                       1 273.0
                                                                                     21.0
          503 0.06076
                                        0 0.573 6.976 91.0 2.1675
                        0.0
                              11.93
                                                                       1 273.0
                                                                                     21.0
                                                                                           396.9
          504 0.10959
                        0.0
                              11.93
                                        0 0.573 6.794 89.3 2.3889
                                                                       1 273.0
                                                                                     21.0
                                                                                           393.4
                                        0 0.573 6.030 80.8 2.5050
          505 0.04741
                        0.0
                              11.93
                                                                       1 273.0
                                                                                     21.0
                                                                                           396.9
         506 rows × 14 columns
In [10]: df.isnull().sum
```

localhost:8888/lab/tree/Downloads/Practicals/ds/Final/Assignment4.ipynb

```
Out[10]: <bound method NDFrame. add numeric operations.<locals>.sum of
                                                                      CRIM
                                                                              ZN I
        NDUS
               CHAS
                      NOX
                             RM
                                   AGE
                                         DIS
                                               RAD
                                                      TAX
        0
             False False False
                                      False False False
                                                         False False False
        1
             False False False False False False
                                                               False False
                   False
                         False False
                                      False False False
                                                               False False
        2
                                                         False
        3
             False
                   False False False
                                      False
                                            False False
                                                         False
                                                                False
                                                                      False
        4
             False
                   False
                         False False
                                      False
                                             False
                                                  False
                                                         False
                                                                False
                                                                     False
        501
            False
                   False
                         False False
                                     False
                                             False False
                                                         False
                                                                False False
        502
             False
                   False False False
                                      False
                                            False False
                                                         False
                                                                False False
             False False False False False False
        503
                                                               False False
             False False False False False False
                                                               False False
        504
             False False False False False False
        505
                                                               False False
             PTRATIO BLACK LSTAT
                                   MEDV
               False False False
        0
        1
               False False False
        2
               False False False
        3
               False False False
        4
               False False False
                       . . .
                             . . .
        . .
               False False False
                                 False
        501
               False False False
        502
        503
               False False False
               False False False
        504
        505
               False False False
        [506 rows x 14 columns]>
In [14]: target_variables = "MEDV"
In [15]: y = df[target_variables]
In [17]: x = df.drop(target variables, axis=1)
In [21]: x.head()
Out[21]:
             CRIM
                   ZN INDUS CHAS
                                    NOX
                                           RM
                                              AGE
                                                      DIS RAD
                                                                 TAX PTRATIO BLACK
        0 0.00632
                  18.0
                         2.31
                                 0 0.538
                                          6.575
                                               65.2 4.0900
                                                             1 296.0
                                                                         15.3
                                                                              396.90
         1 0.02731
                   0.0
                         7.07
                                          6.421
                                               78.9 4.9671
                                                             2 242.0
                                                                              396.90
                                 0 0.469
                                                                         17.8
        2 0.02729
                   0.0
                         7.07
                                 0 0.469
                                         7.185
                                               61.1 4.9671
                                                             2 242.0
                                                                         17.8
                                                                              392.83
        3 0.03237
                   0.0
                                               45.8
                         2.18
                                 0 0.458
                                          6.998
                                                    6.0622
                                                             3 222.0
                                                                         18.7
                                                                              394.63
        4 0.06905
                   0.0
                         2.18
                                 0 0.458 7.147 54.2 6.0622
                                                             3 222.0
                                                                         18.7
                                                                              396.90
In [22]: y.head()
```

```
Out[22]: 0
              24.0
         1
              21.6
         2
              34.7
         3
              33.4
         4
              36.2
         Name: MEDV, dtype: float64
In [23]: from sklearn.model selection import train test split
In [26]: x_train,x_test,y_train,y_test=train_test_split(x,y,test_size = 0.2,random_state =
In [27]: from sklearn.linear model import LinearRegression
In [28]:
         regression = LinearRegression()
In [29]:
         regression.fit(x_train,y_train)
Out[29]: ▼ LinearRegression
         LinearRegression()
         train score = round(regression.score(x train,y train)*100,2)
In [34]: train score
Out[34]: 72.86
In [42]: y_pred = regression.predict(x_test)
In [43]: y_pred
Out[43]: array([23.01506153, 21.2115869, 33.71590384, 31.56542369, 3.1826268,
                 3.15381954, 27.40305304, 22.2126176 , 14.86506114, 21.34105453,
                30.95942941, 26.70065029, 21.12624382, 18.37282564, 17.64315354,
                25.38194186, 24.42970445, 13.36957057, 8.66686786, 18.57490534,
                21.73966467, 20.34270529, 36.5461105, 20.59627495, 19.87979627,
                15.75766967, 37.11632999, 34.85897895, 30.83458635, 23.23441285,
                18.68278505, 20.749546 , 31.84560076, 30.20214207, 13.3861702 ,
                15.87078398, 13.70766096, 23.74163998, 25.95135088, 23.18325878,
                28.99906539, 12.50341936, 31.08347911, 6.39401895, 23.71801218,
                20.61523929, 33.15362417, 19.21862493, 35.89603081, 0.82365329,
                31.90288611, 31.69640543, 6.58849712, 34.62762996, 20.41162545,
                19.69277608, 19.53445865, 18.58689088, 15.81420496, 22.98764309,
                19.65947045, 16.36377019, 18.48783369, 32.76568172, 35.49022568,
                24.58349631, 41.5854766 , 32.94818456, 14.60990256, 27.43178268,
                 8.04470074, 5.61185652, 22.21428332, 18.72817007, 31.02824788,
                26.04494485, 24.60357003, 24.84231113, 25.38796252, 24.87762205,
                33.71343923, 19.72606026, 20.60046055, 27.82692882, 38.0055624,
                37.24265207, 22.16841364, 29.6160177, 31.07303315, 17.93399181,
                20.87524555, 19.48170453, 18.61409692, 37.13055111, 39.81659125,
                 9.1811861 , 35.30202671, 30.28664671, 21.0820992 , 13.65467682,
                31.38696603, 24.99174874])
```

```
In [44]: from sklearn.metrics import r2_score
In [45]: score = round(r2_score(y_test,y_pred)*100,2)
In [47]: print("r2 score is ",score)
        r2 score is 77.89
In [48]: round(regression.score(x test,y test)*100,2)
Out[48]: 77.89
In [49]: from sklearn import metrics
In [51]: print("mean absolute error :",metrics.mean absolute error(y test,y pred))
         print("mean squared absolute error :",metrics.mean_squared_error(y_test,y_pred))
         print("root mean squared absolute error :", np.sqrt(metrics.mean_squared_error(y_te
        mean absolute error : 3.1130437468934313
        mean squared absolute error: 18.495420122448426
        root mean squared absolute error : 4.300630200615768
In [52]: df1 = pd.DataFrame({"Actual":y_test,"Predicted": y_pred,"Variance":y_test-y_pred})
In [53]: df1.head()
Out[53]:
              Actual Predicted
                                Variance
         463
                 20.2 23.015062 -2.815062
          152
                 15.3 21.211587 -5.911587
         291
                 37.3 33.715904
                                3.584096
          183
                 32.5 31.565424
                                 0.934576
         384
                      3.182627 5.617373
                  8.8
In [54]: df1.head(14)
```

Out[54]:		Actual	Predicted	Variance
	463	20.2	23.015062	-2.815062
	152	15.3	21.211587	-5.911587
	291	37.3	33.715904	3.584096
	183	32.5	31.565424	0.934576
	384	8.8	3.182627	5.617373
	141	14.4	3.153820	11.246180
	240	22.0	27.403053	-5.403053
	349	26.6	22.212618	4.387382
	410	15.0	14.865061	0.134939
	150	21.5	21.341055	0.158945
	175	29.4	30.959429	-1.559429
	289	24.8	26.700650	-1.900650
	67	22.0	21.126244	0.873756
	310	16.1	18.372826	-2.272826

In []