assignment-4

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```
Course: M.Sc. Data Science
     2
        Year: 1st
     3
        Reg. No.: 23MSD7044
        Subject: Machine Learning and its Applications
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     11
[1]: import pandas as pd
     import seaborn as sns
     import matplotlib.pyplot as plt
[44]: Housing=pd.read_csv('Housing.csv')
[45]: Housing.head(5)
[45]:
                                           stories mainroad guestroom basement
                                 bathrooms
           price
                 area
                       bedrooms
     0 13300000
                 7420
                                                        yes
                                                                  no
                                                                          no
     1 12250000 8960
                              4
                                        4
                                                 4
                                                        yes
                                                                  no
                                                                          no
     2 12250000 9960
                              3
                                        2
                                                 2
                                                        yes
                                                                  no
                                                                          yes
     3 12215000
                 7500
                              4
                                        2
                                                 2
                                                        yes
                                                                  no
                                                                          yes
     4 11410000 7420
                              4
                                         1
                                                 2
                                                        yes
                                                                 yes
                                                                          yes
```

```
0
                      no
                                      yes
                                                  2
                                                         yes
                                                                     furnished
                                                  3
      1
                                                                     furnished
                      no
                                      yes
                                                          no
      2
                                                  2
                                                         yes
                                                                semi-furnished
                      nο
                                       no
      3
                                                  3
                                                                     furnished
                      no
                                      yes
                                                         yes
      4
                                                  2
                                                                     furnished
                                                          no
                      no
                                      yes
[46]:
      Housing.shape
[46]: (545, 13)
      Housing.describe()
[47]:
                     price
                                     area
                                              bedrooms
                                                         bathrooms
                                                                        stories
             5.450000e+02
                              545.000000
                                           545.000000
                                                        545.000000
                                                                     545.000000
      count
      mean
              4.766729e+06
                              5150.541284
                                              2.965138
                                                           1.286239
                                                                       1.805505
      std
              1.870440e+06
                              2170.141023
                                              0.738064
                                                           0.502470
                                                                       0.867492
      min
              1.750000e+06
                              1650.000000
                                              1.000000
                                                           1.000000
                                                                       1.000000
      25%
              3.430000e+06
                              3600.000000
                                              2.000000
                                                           1.000000
                                                                       1.000000
      50%
             4.340000e+06
                              4600.000000
                                              3.000000
                                                           1.000000
                                                                       2.000000
      75%
              5.740000e+06
                              6360.000000
                                              3.000000
                                                           2.000000
                                                                       2.000000
      max
              1.330000e+07
                             16200.000000
                                              6.000000
                                                           4.000000
                                                                       4.000000
                 parking
             545.000000
      count
      mean
                0.693578
      std
                0.861586
      min
                0.000000
      25%
                0.000000
      50%
                0.000000
      75%
                1.000000
                3.000000
      max
[48]: Housing.info()
     <class 'pandas.core.frame.DataFrame'>
     RangeIndex: 545 entries, 0 to 544
     Data columns (total 13 columns):
           Column
                              Non-Null Count
                                               Dtype
           _____
                              _____
      0
          price
                              545 non-null
                                               int64
      1
                              545 non-null
                                               int64
           area
```

hotwaterheating airconditioning parking prefarea furnishingstatus

int64

int64

int64

object

545 non-null

545 non-null

545 non-null

545 non-null

2

3

4

5

bedrooms

stories

mainroad

bathrooms

```
545 non-null
                                            object
      6
          guestroom
      7
          basement
                           545 non-null
                                            object
                           545 non-null
                                            object
          hotwaterheating
          airconditioning
                           545 non-null
                                            object
                                            int64
      10
         parking
                            545 non-null
      11 prefarea
                            545 non-null
                                            object
      12 furnishingstatus 545 non-null
                                            object
     dtypes: int64(6), object(7)
     memory usage: 55.5+ KB
[49]: Housing.corr()
     /tmp/ipykernel_12463/3434865805.py:1: FutureWarning: The default value of
     numeric_only in DataFrame.corr is deprecated. In a future version, it will
     default to False. Select only valid columns or specify the value of numeric only
     to silence this warning.
       Housing.corr()
                              area bedrooms bathrooms
                                                          stories
                   price
                                                                    parking
                1.000000 0.535997 0.366494
                                               0.517545 0.420712 0.384394
     price
      area
                0.535997 1.000000 0.151858
                                               0.193820 0.083996 0.352980
     bedrooms
                0.366494 0.151858 1.000000
                                               0.373930 0.408564 0.139270
      bathrooms 0.517545 0.193820 0.373930
                                               1.000000 0.326165 0.177496
      stories
                0.420712 0.083996 0.408564
                                               0.326165 1.000000 0.045547
                0.384394 0.352980 0.139270
                                               0.177496 0.045547 1.000000
     parking
[50]: object cols=Housing.columns[Housing.dtypes=='object']
[51]: object_cols
[51]: Index(['mainroad', 'guestroom', 'basement', 'hotwaterheating',
             'airconditioning', 'prefarea', 'furnishingstatus'],
            dtype='object')
[52]: for i in object_cols:
         print(f'{i}: {Housing[i].unique()}')
      binary_obj_cols=['mainroad', 'guestroom', 'basement', |

→ 'hotwaterheating', 'airconditioning', 'prefarea']
     mainroad: ['yes' 'no']
     guestroom: ['no' 'yes']
     basement: ['no' 'yes']
     hotwaterheating: ['no' 'yes']
     airconditioning: ['yes' 'no']
     prefarea: ['yes' 'no']
     furnishingstatus: ['furnished' 'semi-furnished' 'unfurnished']
```

[49]:

```
[53]: for i in range(len(Housing)):
    for j in binary_obj_cols:
        if Housing[j].iloc[i]=='yes':
            Housing[j].iloc[i]=1
        else:
            Housing[j].iloc[i]=0
# Housing['mainroad']=='yes'
```

/tmp/ipykernel_12463/2840574408.py:4: SettingWithCopyWarning:
A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
Housing[j].iloc[i]=1

/tmp/ipykernel_12463/2840574408.py:6: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy Housing[j].iloc[i]=0

[54]: Housing

| [54]: | | price | area | bedrooms | bathrooms | stories | ${\tt mainroad}$ | guestroom | basement | \ |
|-------|-----|----------|------|----------|-----------|---------|------------------|-----------|----------|---|
| | 0 | 13300000 | 7420 | 4 | 2 | 3 | 1 | 0 | 0 | |
| | 1 | 12250000 | 8960 | 4 | 4 | 4 | 1 | 0 | 0 | |
| | 2 | 12250000 | 9960 | 3 | 2 | 2 | 1 | 0 | 1 | |
| | 3 | 12215000 | 7500 | 4 | 2 | 2 | 1 | 0 | 1 | |
| | 4 | 11410000 | 7420 | 4 | 1 | 2 | 1 | 1 | 1 | |
| | | ••• | ••• | ••• | | ••• | ••• | ••• | | |
| | 540 | 1820000 | 3000 | 2 | 1 | 1 | 1 | 0 | 1 | |
| | 541 | 1767150 | 2400 | 3 | 1 | 1 | 0 | 0 | 0 | |
| | 542 | 1750000 | 3620 | 2 | 1 | 1 | 1 | 0 | 0 | |
| | 543 | 1750000 | 2910 | 3 | 1 | 1 | 0 | 0 | 0 | |
| | 544 | 1750000 | 3850 | 3 | 1 | 2 | 1 | 0 | 0 | |

hotwaterheating airconditioning parking prefarea furnishingstatus furnished furnished semi-furnished furnished furnished unfurnished semi-furnished unfurnished

furnished

[545 rows x 13 columns] [55]: Housing.isnull().sum() [55]: price 0 0 area 0 bedrooms bathrooms 0 0 stories mainroad 0 guestroom 0 0 basement hotwaterheating 0 airconditioning 0 parking 0 prefarea 0 furnishingstatus 0 dtype: int64 [56]: for i in binary_obj_cols: Housing[i]=pd.to_numeric(Housing[i]) [57]: Housing.info() <class 'pandas.core.frame.DataFrame'> RangeIndex: 545 entries, 0 to 544 Data columns (total 13 columns): # Column Non-Null Count Dtype _____ _____ 545 non-null 0 price int64 area 545 non-null int64 1 2 bedrooms 545 non-null int64 3 bathrooms 545 non-null int64 4 stories 545 non-null int64 5 mainroad 545 non-null int64 6 guestroom 545 non-null int64 basement 545 non-null int64 hotwaterheating 545 non-null int64 9 airconditioning 545 non-null int64 10 parking 545 non-null int64 11 prefarea 545 non-null int64 furnishingstatus 545 non-null object dtypes: int64(12), object(1)

0

0

0

unfurnished

544

0

memory usage: 55.5+ KB

```
[59]: for i in range(len(Housing)):
          if Housing['furnishingstatus'].iloc[i] == 'furnished':
              Housing['furnishingstatus'].iloc[i]=2
          elif Housing['furnishingstatus'].iloc[i]=='semi-furnished':
              Housing['furnishingstatus'].iloc[i]=1
          elif Housing['furnishingstatus'].iloc[i]=='unfurnished':
              Housing['furnishingstatus'].iloc[i]=0
          # '' 'semi-furnished' 'unfurnished'
     /tmp/ipykernel_12463/1222928369.py:3: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       Housing['furnishingstatus'].iloc[i]=2
     /tmp/ipykernel_12463/1222928369.py:6: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       Housing['furnishingstatus'].iloc[i]=1
     /tmp/ipykernel_12463/1222928369.py:9: SettingWithCopyWarning:
     A value is trying to be set on a copy of a slice from a DataFrame
     See the caveats in the documentation: https://pandas.pydata.org/pandas-
     docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy
       Housing['furnishingstatus'].iloc[i]=0
[60]: Housing
[60]:
                                      bathrooms
                                                 stories
                                                          mainroad
              price
                     area
                           bedrooms
                                                                    guestroom
      0
           13300000
                     7420
                                   4
                                              2
                                                       3
                                                                 1
                                                                             0
      1
           12250000 8960
                                   4
                                              4
                                                       4
                                                                 1
                                                                             0
      2
           12250000
                     9960
                                  3
                                              2
                                                       2
                                                                 1
                                                                             0
      3
                                   4
                                              2
                                                       2
                                                                  1
           12215000 7500
                                                                             0
      4
           11410000 7420
                                   4
                                              1
                                                       2
                                                                  1
                                                                             1
      540
           1820000 3000
                                  2
                                              1
                                                                 1
                                                                             0
                                                       1
      541
            1767150 2400
                                  3
                                                                 0
                                              1
                                                       1
                                                                             0
                                  2
      542
           1750000 3620
                                              1
                                                       1
                                                                 1
                                                                             0
      543
            1750000 2910
                                  3
                                              1
                                                       1
                                                                 0
                                                                             0
      544
            1750000 3850
                                  3
                                              1
                                                       2
                                                                 1
                                                                             0
```

[]:

| | basement | hotwaterheating | airconditioning | parking | prefarea \ |
|-----|----------|-----------------|-----------------|---------|------------|
| 0 | 0 | 0 | 1 | 2 | 1 |
| 1 | 0 | 0 | 1 | 3 | 0 |
| 2 | 1 | 0 | 0 | 2 | 1 |
| 3 | 1 | 0 | 1 | 3 | 1 |
| 4 | 1 | 0 | 1 | 2 | 0 |
| | ••• | ••• | | | |
| 540 | 1 | 0 | 0 | 2 | 0 |
| 541 | 0 | 0 | 0 | 0 | 0 |
| 542 | 0 | 0 | 0 | 0 | 0 |
| 543 | 0 | 0 | 0 | 0 | 0 |
| 544 | 0 | 0 | 0 | 0 | 0 |

furnishingstatus

| 0 | 2 |
|-----|---|
| 1 | 2 |
| 2 | 1 |
| 3 | 2 |
| 4 | 2 |
| | |
| 540 | 0 |
| 541 | 1 |
| 542 | 0 |
| 543 | 2 |
| 544 | 0 |

[545 rows x 13 columns]

```
[62]: Housing['furnishingstatus']=pd.to_numeric(Housing['furnishingstatus'])
```

[64]: Housing.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 545 entries, 0 to 544
Data columns (total 13 columns):

| | (| | |
|---|-----------------|----------------|-------|
| # | Column | Non-Null Count | Dtype |
| | | | |
| 0 | price | 545 non-null | int64 |
| 1 | area | 545 non-null | int64 |
| 2 | bedrooms | 545 non-null | int64 |
| 3 | bathrooms | 545 non-null | int64 |
| 4 | stories | 545 non-null | int64 |
| 5 | mainroad | 545 non-null | int64 |
| 6 | guestroom | 545 non-null | int64 |
| 7 | basement | 545 non-null | int64 |
| 8 | hotwaterheating | 545 non-null | int64 |

9 airconditioning 545 non-null int64 10 parking 545 non-null int64 11 prefarea 545 non-null int64 12 furnishingstatus 545 non-null int64

dtypes: int64(13) memory usage: 55.5 KB

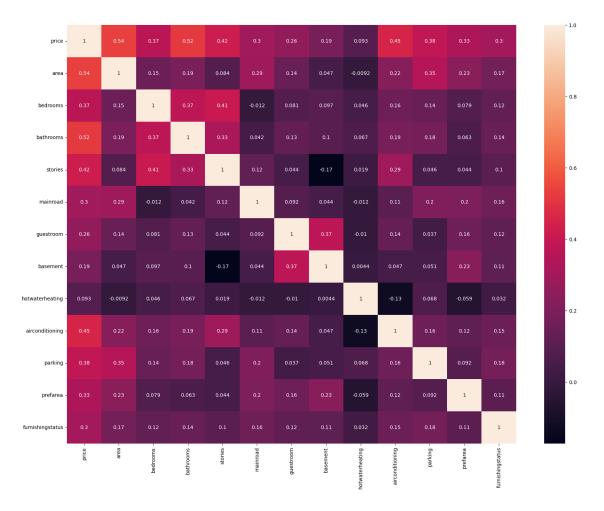
[65]: Housing.corr()

| [65]: | | price | area | bedrooms | bathrooms | stories | ${\tt mainroad}$ | \ |
|-------|------------------|-----------|-----------|-----------|------------|-------------|------------------|---|
| | price | 1.000000 | 0.535997 | 0.366494 | 0.517545 | 0.420712 | 0.296898 | |
| | area | 0.535997 | 1.000000 | 0.151858 | 0.193820 | 0.083996 | 0.288874 | |
| | bedrooms | 0.366494 | 0.151858 | 1.000000 | 0.373930 | 0.408564 | -0.012033 | |
| | bathrooms | 0.517545 | 0.193820 | 0.373930 | 1.000000 | 0.326165 | 0.042398 | |
| | stories | 0.420712 | 0.083996 | 0.408564 | 0.326165 | 1.000000 | 0.121706 | |
| | mainroad | 0.296898 | 0.288874 | -0.012033 | 0.042398 | 0.121706 | 1.000000 | |
| | guestroom | 0.255517 | 0.140297 | 0.080549 | 0.126469 | 0.043538 | 0.092337 | |
| | basement | 0.187057 | 0.047417 | 0.097312 | 0.102106 | -0.172394 | 0.044002 | |
| | hotwaterheating | 0.093073 | -0.009229 | 0.046049 | 0.067159 | 0.018847 | -0.011781 | |
| | airconditioning | 0.452954 | 0.222393 | 0.160603 | 0.186915 | 0.293602 | 0.105423 | |
| | parking | 0.384394 | 0.352980 | 0.139270 | 0.177496 | 0.045547 | 0.204433 | |
| | prefarea | 0.329777 | 0.234779 | 0.079023 | 0.063472 | 0.044425 | 0.199876 | |
| | furnishingstatus | 0.304721 | 0.171445 | 0.123244 | 0.143559 | 0.104672 | 0.156726 | |
| | | | | | | | | |
| | | guestroom | basement | hotwater | heating ai | ircondition | ing \ | |
| | price | 0.255517 | 0.187057 | 0 | .093073 | 0.452 | 2954 | |
| | area | 0.140297 | 0.047417 | -0 | .009229 | 0.222 | 2393 | |
| | bedrooms | 0.080549 | 0.097312 | 0 | .046049 | 0.160 | 0603 | |
| | bathrooms | 0.126469 | 0.102106 | 0 | .067159 | 0.186 | 915 | |
| | stories | 0.043538 | -0.172394 | 0 | .018847 | 0.293 | 3602 | |
| | mainroad | 0.092337 | 0.044002 | -0 | .011781 | 0.105 | 423 | |
| | guestroom | 1.000000 | 0.372066 | -0 | .010308 | 0.138 | 3179 | |
| | basement | 0.372066 | 1.000000 | 0 | .004385 | 0.047 | '341 | |
| | hotwaterheating | -0.010308 | 0.004385 | 1 | .000000 | -0.130 | 0023 | |
| | airconditioning | 0.138179 | 0.047341 | -0 | .130023 | 1.000 | 0000 | |
| | parking | 0.037466 | 0.051497 | 0 | .067864 | 0.159 | 9173 | |
| | prefarea | 0.160897 | 0.228083 | -0 | .059411 | 0.117 | '382 | |
| | furnishingstatus | 0.118328 | 0.112831 | 0 | .031628 | 0.150 |)477 | |
| | | | | | | | | |
| | | parking | prefarea | furnishin | gstatus | | | |
| | price | 0.384394 | 0.329777 | 0 | .304721 | | | |
| | area | 0.352980 | 0.234779 | 0 | .171445 | | | |
| | bedrooms | 0.139270 | 0.079023 | 0 | .123244 | | | |
| | bathrooms | 0.177496 | 0.063472 | 0 | .143559 | | | |
| | stories | 0.045547 | 0.044425 | 0 | .104672 | | | |
| | mainroad | 0.204433 | 0.199876 | 0 | .156726 | | | |
| | guestroom | 0.037466 | 0.160897 | 0 | .118328 | | | |
| | | | | | | | | |

```
basement
                  0.051497
                            0.228083
                                               0.112831
                                               0.031628
hotwaterheating
                  0.067864 -0.059411
airconditioning
                  0.159173
                             0.117382
                                               0.150477
parking
                  1.000000
                             0.091627
                                               0.177539
prefarea
                  0.091627
                             1.000000
                                               0.107686
furnishingstatus
                                               1.000000
                  0.177539
                            0.107686
```

```
[67]: plt.figure(figsize=(20,15))
sns.heatmap(Housing.corr(),annot=True)
```

[67]: <Axes: >



11.0.1 Which features seem to influence house prices the most?

Answer: Area seem to influence house price the most

```
[72]: from sklearn.model_selection import train_test_split from sklearn.linear_model import LinearRegression
```

```
[70]: X=Housing.drop('price',axis=1)
[71]: y=Housing['price']
[78]: X_train, X_test, y_train, y_test=train_test_split(X,y,random_state=100,test_size=0.
       →3)
[79]: lr_model=LinearRegression()
[80]: lr_model.fit(X_train,y_train)
[80]: LinearRegression()
[81]: pred=lr_model.predict(X_test)
     from sklearn.metrics import mean_absolute_error
[98]:
     mean_absolute_error(y_true=y_test,y_pred=pred)
[99]:
[99]: 832364.898688936
     11.0.2 How accurate are the model's predictions?
     Answer: Models predictions seem to be off by large number.
     11.0.3 Can you identify any limitations in the model?
     Answer: Model might be overfitting.
     11.0.4 What could be done to improve the model's accuracy or address its limitations?
     Answer: Ensemble techniques can be used to improve predictions.
```

[]: