Bengaluru_home_price_prediction

December 28, 2024

1 Data Science Project: Predicting Home Prices in Banglore

2 Loading the data

```
[202]: df1=pd.read_csv("Bengaluru_House_Data.csv")
[204]: df1.head()
[204]:
                     area_type
                                 availability
                                                                location
                                                                               size
          Super built-up Area
                                       19-Dec Electronic City Phase II
                                                                              2 BHK
                                                       Chikka Tirupathi
       1
                    Plot Area Ready To Move
                                                                         4 Bedroom
                Built-up Area Ready To Move
                                                             Uttarahalli
                                                                              3 ВНК
       3 Super built-up Area Ready To Move
                                                     Lingadheeranahalli
                                                                              3 BHK
       4 Super built-up Area Ready To Move
                                                                              2 BHK
                                                                Kothanur
          society total_sqft bath
                                   balcony
                                              price
                                              39.07
       0
         Coomee
                        1056
                               2.0
                                        1.0
                        2600
                               5.0
       1
         Theanmp
                                        3.0
                                             120.00
       2
              NaN
                        1440
                               2.0
                                        3.0
                                              62.00
       3 Soiewre
                        1521
                               3.0
                                        1.0
                                              95.00
              NaN
                        1200
                               2.0
                                        1.0
                                              51.00
      df1.shape
[206]:
[206]: (13320, 9)
[208]: df1.groupby("area_type")["area_type"].agg("count")
```

```
[208]: area_type
       Built-up Area
                               2418
       Carpet Area
                                 87
       Plot Area
                               2025
       Super built-up Area
                               8790
       Name: area_type, dtype: int64
      2.0.1 Droping the features that are not required to build our model
[210]: df2 = df1.drop(["area_type", "society", "balcony", "availability"], axis="columns")
       df2.head()
                          location
                                          size total_sqft bath
[210]:
                                                                  price
         Electronic City Phase II
                                         2 BHK
                                                     1056
                                                            2.0
                                                                  39.07
                  Chikka Tirupathi 4 Bedroom
                                                     2600
                                                            5.0 120.00
       1
                       Uttarahalli
                                         3 BHK
       2
                                                     1440
                                                            2.0
                                                                  62.00
       3
                Lingadheeranahalli
                                         3 BHK
                                                     1521
                                                            3.0
                                                                  95.00
                          Kothanur
                                         2 BHK
                                                     1200
                                                            2.0
                                                                  51.00
          Data Cleaning
[212]: df2.isnull().sum()
[212]: location
                      1
       size
                     16
       total_sqft
       bath
                     73
       price
                      0
       dtype: int64
[214]: df3 = df2.dropna()
       df3.isnull().sum()
[214]: location
                     0
       size
                     0
       total_sqft
                     0
       bath
                     0
       price
       dtype: int64
[216]: df3.shape
[216]: (13246, 5)
[218]: df3["size"].unique()
```

```
[218]: array(['2 BHK', '4 Bedroom', '3 BHK', '4 BHK', '6 Bedroom', '3 Bedroom',
              '1 BHK', '1 RK', '1 Bedroom', '8 Bedroom', '2 Bedroom',
              '7 Bedroom', '5 BHK', '7 BHK', '6 BHK', '5 Bedroom', '11 BHK',
              '9 BHK', '9 Bedroom', '27 BHK', '10 Bedroom', '11 Bedroom',
              '10 BHK', '19 BHK', '16 BHK', '43 Bedroom', '14 BHK', '8 BHK',
              '12 Bedroom', '13 BHK', '18 Bedroom'], dtype=object)
```

4 Feature Engineering

4.0.1 Add new feature(integer) for bhk (Bedrooms Hall Kitchen)

```
[220]: df3["bhk"]=df3["size"].apply(lambda x: int(x.split(" ")[0]))
       #delilmeter(" ") ke through split kre or first index ki value liye[0] delimeter_
        ⇔se
[222]: df3.head()
[222]:
                          location
                                         size total_sqft bath
                                                                 price
                                                                        bhk
      O Electronic City Phase II
                                        2 BHK
                                                    1056
                                                           2.0
                                                                 39.07
                                                                          2
                  Chikka Tirupathi 4 Bedroom
                                                           5.0 120.00
       1
                                                    2600
                                                                          4
       2
                       Uttarahalli
                                                           2.0
                                                                 62.00
                                        3 BHK
                                                    1440
                                                                          3
       3
                Lingadheeranahalli
                                        3 BHK
                                                    1521
                                                           3.0
                                                                 95.00
                                                                          3
                          Kothanur
                                        2 BHK
                                                    1200
                                                           2.0
                                                                 51.00
[224]: df3["bhk"].unique()
[224]: array([ 2, 4, 3, 6, 1, 8, 7, 5, 11, 9, 27, 10, 19, 16, 43, 14, 12,
              13, 18], dtype=int64)
[226]: df3["total_sqft"].unique()
[226]: array(['1056', '2600', '1440', ..., '1133 - 1384', '774', '4689'],
             dtype=object)
[228]: def is_float(x):
           try:
               float(x)
           except:
               return False
           return True
[230]: df3[~df3["total_sqft"].apply(is_float)].head()
[230]:
                      location
                                        total_sqft bath
                                 size
                                                            price
                                                                   bhk
       30
                     Yelahanka 4 BHK
                                       2100 - 2850
                                                     4.0
                                                         186.000
       122
                        Hebbal 4 BHK
                                       3067 - 8156
                                                     4.0 477.000
       137 8th Phase JP Nagar 2 BHK 1042 - 1105
                                                     2.0
                                                           54.005
```

```
165
                      Sarjapur 2 BHK 1145 - 1340
                                                     2.0
                                                            43.490
                                                                      2
       188
                      KR Puram 2 BHK 1015 - 1540
                                                     2.0
                                                           56.800
                                                                      2
[232]: def convert_sqrt_to_num(x):
           tokens=x.split("-")
           if len(tokens)==2:
               return (float(tokens[0])+float(tokens[1]))/2
           try:
               return float(x)
           except:
               return None
       #jaha bhi value (123-1232) ye form me h we are taking the avg of it using the
        →above func
[234]: convert sqrt to num("2100")
[234]: 2100.0
[236]: convert_sqrt_to_num("2100 - 2850")
[236]: 2475.0
[238]: df4=df3.copy()
       df4["total_sqft"]=df4["total_sqft"].apply(convert_sqrt_to_num)
       df4.head()
[238]:
                          location
                                         size total_sqft bath
                                                                  price
                                                                         bhk
      O Electronic City Phase II
                                        2 BHK
                                                   1056.0
                                                            2.0
                                                                  39.07
                                                                            2
                                                                 120.00
       1
                  Chikka Tirupathi 4 Bedroom
                                                   2600.0
                                                            5.0
                                                                            4
       2
                       Uttarahalli
                                        3 ВНК
                                                   1440.0
                                                            2.0
                                                                  62.00
                                                                            3
                                        3 BHK
                                                                  95.00
       3
                Lingadheeranahalli
                                                   1521.0
                                                            3.0
                                                                            3
       4
                          Kothanur
                                        2 BHK
                                                   1200.0
                                                            2.0
                                                                  51.00
                                                                            2
[240]: df4.loc[30]
                      # checking the value of total_sqrt for a particular index
[240]: location
                     Yelahanka
                         4 BHK
       size
                        2475.0
       total sqft
      bath
                           4.0
      price
                         186.0
       Name: 30, dtype: object
      (2100+2850)/2
[242]:
[242]: 2475.0
```

Feature Engineering

```
[244]: df5= df4.copy()
       df5["price_per_sqrft"] = df5["price"]*100000 / df5["total_sqft"]
       df5.head()
[244]:
                          location
                                                total_sqft
                                                            bath
                                                                   price
                                                                          bhk
                                         size
         Electronic City Phase II
                                         2 BHK
                                                    1056.0
                                                             2.0
                                                                   39.07
                                                                            2
                  Chikka Tirupathi 4 Bedroom
                                                    2600.0
                                                             5.0
                                                                  120.00
       1
                                                                            4
       2
                       Uttarahalli
                                         3 ВНК
                                                    1440.0
                                                                   62.00
                                                             2.0
       3
                Lingadheeranahalli
                                        3 BHK
                                                    1521.0
                                                             3.0
                                                                   95.00
                                                                            3
       4
                          Kothanur
                                        2 BHK
                                                    1200.0
                                                             2.0
                                                                   51.00
          price_per_sqrft
       0
              3699.810606
       1
              4615.384615
       2
              4305.55556
       3
              6245.890861
       4
              4250,000000
      len(df5.location.unique())
[246]: 1304
      5.1 Examine locations which is a categorical variable. We need to apply dimen-
           sionality reduction technique here to reduce number of locations
```

```
[248]: df5.location = df5.location.apply(lambda x : x.strip()) #removing the extra_
        ⇒space from the loc col
      location_stats = df5.groupby("location")["location"].agg("count").
        sort_values(ascending = False)
      location_stats
```

```
[248]: location
      Whitefield
                                 535
       Sarjapur Road
                                 392
      Electronic City
                                 304
      Kanakpura Road
                                 266
       Thanisandra
                                 236
       1 Giri Nagar
                                   1
      Kanakapura Road,
                                   1
      Kanakapura main Road
                                   1
      Karnataka Shabarimala
                                   1
       whitefiled
                                   1
       Name: location, Length: 1293, dtype: int64
```

```
[250]: len(location_stats[location_stats<=10])
[250]: 1052
          Dimensionality Reduction
[357]: location_stats_less_than_10 = location_stats[location_stats<=10]
       location_stats_less_than_10
[357]: location
       Basapura
                                 10
       1st Block Koramangala
                                 10
       Gunjur Palya
                                 10
       Kalkere
                                 10
       Sector 1 HSR Layout
                                 10
       1 Giri Nagar
                                  1
       Kanakapura Road,
                                  1
       Kanakapura main Road
       Karnataka Shabarimala
                                  1
       whitefiled
       Name: location, Length: 1052, dtype: int64
[359]: len(df5.location.unique())
[359]: 242
[256]: df5.location = df5.location.apply(lambda x : "other" if x in_
        →location_stats_less_than_10 else x)
       len(df5.location.unique())
[256]: 242
[258]: df5.head(10)
[258]:
                                                total_sqft
                          location
                                                                           bhk
                                                                                \
                                          size
                                                             bath
                                                                    price
          Electronic City Phase II
                                         2 BHK
                                                     1056.0
                                                                    39.07
                                                              2.0
                                                                   120.00
                  Chikka Tirupathi
       1
                                    4 Bedroom
                                                     2600.0
                                                              5.0
                                                                             4
       2
                       Uttarahalli
                                         3 BHK
                                                     1440.0
                                                                    62.00
                                                              2.0
                                                                             3
                                                                    95.00
       3
                Lingadheeranahalli
                                         3 BHK
                                                     1521.0
                                                              3.0
                                                                             3
       4
                          Kothanur
                                         2 BHK
                                                     1200.0
                                                              2.0
                                                                    51.00
                                                                             2
       5
                        Whitefield
                                         2 BHK
                                                     1170.0
                                                              2.0
                                                                    38.00
                                                                             2
       6
                  Old Airport Road
                                         4 BHK
                                                                   204.00
                                                    2732.0
                                                              4.0
       7
                      Rajaji Nagar
                                         4 BHK
                                                    3300.0
                                                                   600.00
                                                              4.0
       8
                      Marathahalli
                                         3 ВНК
                                                     1310.0
                                                              3.0
                                                                    63.25
                                                                             3
       9
                              other 6 Bedroom
                                                     1020.0
                                                              6.0
                                                                   370.00
```

```
price_per_sqrft
0
       3699.810606
1
       4615.384615
2
       4305.55556
3
       6245.890861
4
       4250.000000
5
       3247.863248
6
       7467.057101
7
      18181.818182
8
       4828.244275
9
      36274.509804
```

7 Outlier Removal

```
[260]: df5[df5.total_sqft/df5.bhk<300].head() #here we r removing the outliers ex_{\square} \rightarrow if \ toto\_sqft/bhk \ is \ less \ than \ 300 \ we \ should \ remove \ it . this \ are \ all \ data_{\square} \rightarrow error
```

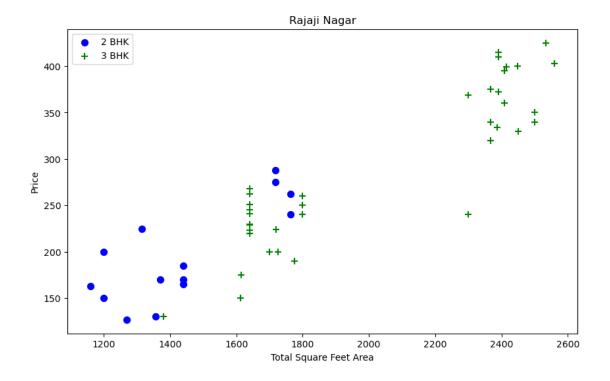
```
[260]:
                      location
                                      size
                                            total_sqft
                                                        bath
                                                              price
                                                                      bhk
                         other
                               6 Bedroom
                                                1020.0
                                                          6.0
                                                               370.0
                                                                        6
       9
       45
                    HSR Layout 8 Bedroom
                                                          9.0
                                                               200.0
                                                 600.0
                                                                        8
                 Murugeshpalya
       58
                                6 Bedroom
                                                1407.0
                                                          4.0 150.0
                                                                        6
       68
           Devarachikkanahalli
                                 8 Bedroom
                                                1350.0
                                                          7.0
                                                                85.0
                                                                        8
       70
                         other 3 Bedroom
                                                 500.0
                                                          3.0 100.0
                                                                        3
```

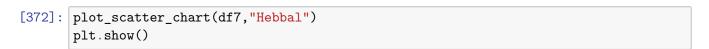
7.0.1 Check above data points. We have 6 bhk apartment with 1020 sqft. Another one is 8 bhk and total sqft is 600. These are clear data errors that can be removed safely

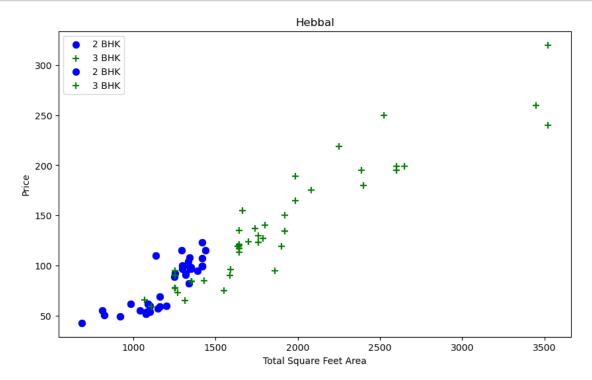
[264]: (12502, 7)

8 Outlier Removal Using Standard Deviation and Mean

```
[364]: df6.price_per_sqrft.describe()
[364]: count
                 12456.000000
                  6308.502826
      mean
                  4168.127339
       std
                   267.829813
      min
       25%
                  4210.526316
       50%
                  5294.117647
       75%
                  6916.666667
                176470.588235
      max
       Name: price_per_sqrft, dtype: float64
[366]: def removing_pps_outliers(df):
           df_out = pd.DataFrame()
           for key,subdf in df.groupby("location"):
               m = np.mean(subdf.price_per_sqrft)
               st = np.std(subdf.price_per_sqrft)
               reduce_df = subdf[(subdf.price_per_sqrft>(m-st)) & (subdf.
        →price_per_sqrft<=(m+st))]</pre>
               df_out = pd.concat([df_out,reduce_df],ignore_index=True)
           return df_out
       df7 = removing_pps_outliers(df6)
       df7.shape
[366]: (10241, 7)
[368]: def plot_scatter_chart(df,location):
           bhk2 = df[(df.location==location) & (df.bhk==2)]
           bhk3 = df[(df.location==location) & (df.bhk==3)]
           matplotlib.rcParams["figure.figsize"] = (10,6)
           plt.scatter(bhk2.total_sqft,bhk2.price,color = "blue",label="2 BHK", s=50)
           plt.scatter(bhk3.total_sqft,bhk3.price,marker = "+", color =__
        ⇔"green",label="3 BHK", s=50)
           plt.xlabel("Total Square Feet Area")
           plt.ylabel("Price")
           plt.title(location)
           plt.legend()
       plot_scatter_chart(df7 , "Rajaji Nagar")
       plt.show()
```







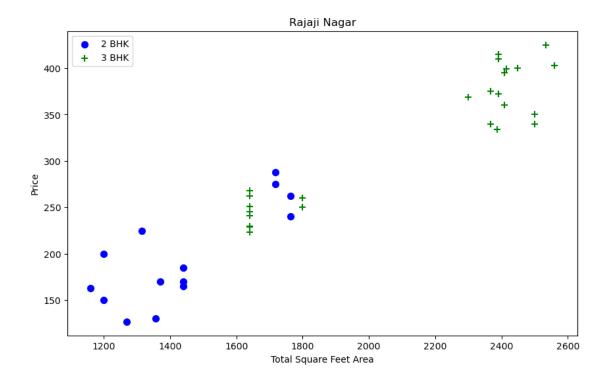
We should also remove properties where for same location, the price of (for example) 3 bedroom apartment is less than 2 bedroom apartment (with same square ft area). What we will do is for a given location, we will build a dictionary of stats per bhk, i.e.

 $\{$ '1' : $\{$ 'mean': 4000, 'std: 2000, 'count': 34 $\}$, '2' : $\{$ 'mean': 4300, 'std: 2300, 'count': 22 $\}$, $\}$ Now we can remove those 2 BHK apartments whose price_per_sqft is less than mean price_per_sqft of 1 BHK apartment

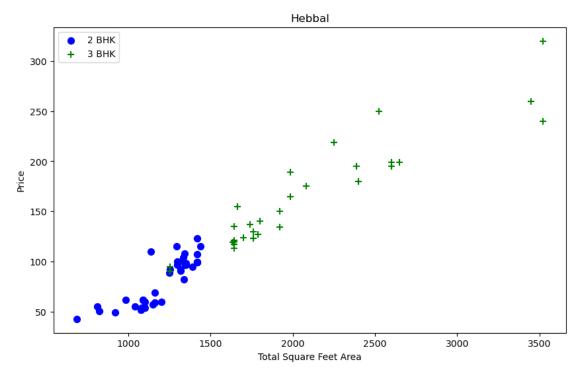
```
[384]: # in this func we r trying to remove the outliers whose 2bhk price is more than
        ⇔the 3 bhk price
       def remove_bhk_outliers(df):
           exclude_indices = np.array([])
           for location, location_df in df.groupby("location"):
               bhk_stats={}
               for bhk,bhk_df in location_df.groupby("bhk"):
                   bhk stats[bhk] = {
                       "mean":np.mean(bhk_df.price_per_sqrft),
                       "std":np.std(bhk_df.price_per_sqrft),
                       "count" : bhk_df.shape[0]
               for bhk,bhk_df in location_df.groupby("bhk"):
                   stats = bhk stats.get(bhk-1)
                   if stats and stats["count"]>5:
                       exclude_indices = np.append(exclude_indices,bhk_df[bhk_df.
        →price_per_sqrft<(stats["mean"])].index.values)</pre>
           return df.drop(exclude indices,axis="index")
       df8 = remove bhk outliers(df7)
       df8.shape
```

```
[384]: (7329, 7)

[386]: plot_scatter_chart(df8 ,"Rajaji Nagar")
    plt.show()
```

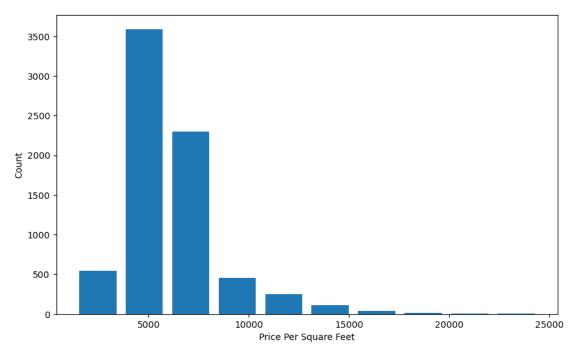




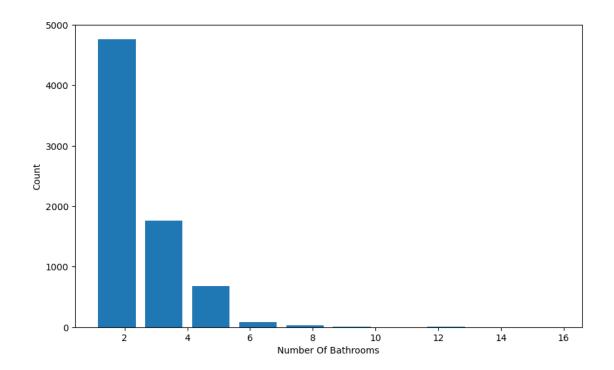


```
[330]: plt.hist(df8.price_per_sqrft,rwidth=0.8)
  plt.xlabel("Price Per Square Feet")
  plt.ylabel("Count")

plt.show()
```



```
[282]: df8.bath.unique()
[282]: array([ 4., 3., 2., 5., 8., 1., 6., 7., 9., 12., 16., 13.])
[284]:
       df8[df8.bath>10]
[284]:
                   location
                                                  bath price
                               size
                                     total_sqft
                                                               bhk
                                                                    price_per_sqrft
             Neeladri Nagar
       5277
                             10 BHK
                                          4000.0
                                                  12.0
                                                       160.0
                                                                10
                                                                         4000.000000
       8486
                      other
                             10 BHK
                                         12000.0
                                                  12.0
                                                        525.0
                                                                10
                                                                         4375.000000
       8575
                      other
                             16 BHK
                                         10000.0
                                                  16.0
                                                        550.0
                                                                         5500.000000
                                                                16
       9308
                      other
                             11 BHK
                                          6000.0
                                                  12.0
                                                        150.0
                                                                11
                                                                         2500.000000
       9639
                      other
                             13 BHK
                                          5425.0
                                                 13.0
                                                        275.0
                                                                         5069.124424
                                                                13
[336]: plt.hist(df8.bath,rwidth=0.8)
       plt.xlabel("Number Of Bathrooms")
       plt.ylabel("Count")
       plt.show()
```



It is unusual to have 2 more bathrooms than number of bedrooms in a home

```
[288]:
      df8[df8.bath>df8.bhk+2]
[288]:
                   location
                                   size
                                         total_sqft
                                                      bath
                                                             price
                                                                     bhk
                                                                          price_per_sqrft
       1626
             Chikkabanavar
                             4 Bedroom
                                             2460.0
                                                       7.0
                                                              80.0
                                                                       4
                                                                              3252.032520
       5238
                Nagasandra
                             4 Bedroom
                                             7000.0
                                                       8.0
                                                             450.0
                                                                       4
                                                                              6428.571429
               Thanisandra
       6711
                                  3 BHK
                                             1806.0
                                                       6.0
                                                             116.0
                                                                       3
                                                                               6423.034330
                                 6 BHK
       8411
                                                            1000.0
                      other
                                            11338.0
                                                       9.0
                                                                       6
                                                                              8819.897689
       df8.shape
[290]:
[290]: (7329, 7)
[292]: df9 = df8[df8.bath < df8.bhk + 2]
       df9.shape
[292]: (7251, 7)
[294]: df10 = df9.drop(["size", "price_per_sqrft"], axis="columns")
       df10.head()
[294]:
                      location
                                total_sqft
                                             bath
                                                   price
                                                           bhk
          1st Block Jayanagar
                                     2850.0
                                              4.0
                                                    428.0
                                                             4
          1st Block Jayanagar
                                     1630.0
                                              3.0
                                                   194.0
                                                             3
       1
       2 1st Block Jayanagar
                                     1875.0
                                              2.0
                                                   235.0
                                                             3
```

```
3 1st Block Jayanagar 1200.0 2.0 130.0 3
4 1st Block Jayanagar 1235.0 2.0 148.0 2
```

8.1 Use One Hot Encoding For Location

[296]: dummies = pd.get_dummies(df10.location) dummies

[296]:		1st Block Jayanag	gar 1st Phase 3	JP Nagar 2nd	Phase Judicial Lay	out \
	0		rue	False	•	.lse
	1	Tı	rue	False	Fa	.lse
	2		rue	False		.lse
	3		rue	False		.lse
	4		rue	False		.lse
	•••	•••		•••	•••	
	10232	Fa]	se	False	Fa	.lse
	10233	Fa]	se	False	Fa	lse
	10236	Fa]	.se	False	Fa	.lse
	10237	Fa]	.se	False	Fa	.lse
	10240	Fa]	se	False	Fa	.lse
				Hbr Layout	5th Phase JP Nagar	\
	0	Fa	alse	False	False	
	1	Fa	alse	False	False	
	2	Fa	alse	False	False	
	3	Fa	alse	False	False	
	4	Fa	alse	False	False	
		•••		•••	•••	
	10232	Fa	alse	False	False	
	10233	Fa	alse	False	False	
	10236	Fa	alse	False	False	
	10237	Fa	alse	False	False	
	10240	Fa	alse	False	False	
		6th Phase JP Naga	ar 7th Phase II	P Nagar 8th	Phase JP Nagar \	
	0	Fals		False	False	
	1	Fals		False	False	
	2	Fals		False	False	
	3	Fals		False	False	
	4	Fals		False	False	
	 10232	 Fals		False	 False	
	10233	Fals		False	False	
	10236	Fals		False	False	
	10237	Fals		False	False	
	10240	Fals		False	False	

```
0
                            False
                                                      False
                                                                            False
       1
                            False
                                                      False
                                                                            False
       2
                                                      False
                                                                            False
                            False
       3
                            False
                                                      False
                                                                            False
       4
                            False
                                                      False
                                                                            False
       10232
                            False
                                                      False
                                                                            False
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       [7251 rows x 242 columns]
[298]: df11 = pd.concat([df10,dummies.drop("other",axis="columns")],axis="columns")
       df11.head()
[298]:
                      location total_sqft
                                             bath price bhk
                                                                1st Block Jayanagar \
         1st Block Jayanagar
                                    2850.0
                                              4.0
                                                   428.0
                                                                                True
          1st Block Jayanagar
                                                  194.0
                                    1630.0
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Vishveshwarya Layout

Vishwapriya Layout \

9th Phase JP Nagar

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       3 1st Block Jayanagar
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       4 1st Block Jayanagar
                                    1235.0
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       [5 rows x 246 columns]
[300]: df12 = df11.drop("location",axis="columns")
       df12.head()
[300]:
          total_sqft
                                          1st Block Jayanagar
                                                                1st Phase JP Nagar
                      bath price
                                    bhk
              2850.0
                             428.0
                                       4
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                                     2nd Stage Nagarbhavi 5th Block Hbr Layout
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       [5 rows x 245 columns]
      8.2 Build a Model Now......
[302]: df12.shape
[302]: (7251, 245)
[304]: X=df12.drop("price",axis="columns")
       X.head()
       #separating the dependent and the independent variable
                                                         1st Phase JP Nagar
[304]:
                                  1st Block Jayanagar
          total_sqft
                       bath
                             bhk
              2850.0
       0
                        4.0
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                                                                       False
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              1630.0
                        3.0
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              1235.0
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          2nd Phase Judicial Layout
                                       2nd Stage Nagarbhavi 5th Block Hbr Layout
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       [5 rows x 244 columns]
[306]: y=df12.price
       y.head()
[306]: 0
            428.0
            194.0
       1
       2
            235.0
       3
            130.0
       4
            148.0
       Name: price, dtype: float64
[308]: from sklearn.model_selection import train_test_split
       x_train,x_test,y_train,y_test = train_test_split(X,y,test_size=0.
        →2,random_state=10)
[310]: from sklearn.linear_model import LinearRegression
       lr = LinearRegression()
       lr.fit(x_train,y_train)
       lr.score(x_test,y_test)
```

[310]: 0.8452277697873772

8.3 Use K Fold cross validation to measure accuracy of our LinearRegression model

```
[312]: from sklearn.model_selection import ShuffleSplit
from sklearn.model_selection import cross_val_score

cv = ShuffleSplit(n_splits=5, test_size=0.2,random_state=0)
cross_val_score(LinearRegression(),X,y,cv=cv)
```

[312]: array([0.82430186, 0.77166234, 0.85089567, 0.80837764, 0.83653286])

8.4 Find best model using GridSearchCV

```
[314]: from sklearn.model_selection import GridSearchCV
       from sklearn.linear_model import LinearRegression
       from sklearn.linear_model import Lasso
       from sklearn.tree import DecisionTreeRegressor
       import pandas as pd
       from sklearn.model_selection import ShuffleSplit
       def find_best_model_using_gridsearchcv(X, y):
           algos = {
               "linear regression": {
               "model": LinearRegression(fit_intercept=True, copy_X=True,__
        →positive=True),
               "params": {
                   "n_jobs": [1, 2, 4]
               },
               "lasso": {
                   "model": Lasso(),
                   "params": {
                       "alpha": [1, 2],
                       "selection": ["random", "cyclic"]
                   }
               },
               "decision_tree": {
                   "model": DecisionTreeRegressor(),
                   "params": {
                       "criterion": ["mse", "friedman_mse"],
                       "splitter": ["best", "random"]
               }
           }
```

```
scores = []
           cv = ShuffleSplit(n_splits=5, test_size=0.2, random_state=0)
           for algo_name, config in algos.items():
               gs = GridSearchCV(config["model"], config["params"], cv=cv,
        →return_train_score=False)
               gs.fit(X, y)
               scores.append({
                   "model": algo_name,
                   "best_score": gs.best_score_,
                   "best_params": gs.best_params_
               })
           return pd.DataFrame(scores, columns=["model", "best_score", "best_params"])
       find_best_model_using_gridsearchcv(X, y)
[314]:
                      model best_score \
        linear_regression
                               0.788689
                      lasso
       1
                               0.687429
              decision_tree
                               0.715706
                                                best_params
       0
                                              {'n_jobs': 1}
                        {'alpha': 1, 'selection': 'cyclic'}
       1
        {'criterion': 'friedman_mse', 'splitter': 'best'}
      8.5 Test the model for few properties
[316]: def predict_price(location, sqft, bath, bhk):
           loc_index = np.where(X.columns==location)[0][0]
           x = np.zeros(len(X.columns))
           x[0] = sqft
           x[1] = bath
           x[2] = bhk
           if loc_index >= 0:
               x[loc_index] = 1
           return lr.predict([x])[0]
[318]: predict_price('1st Phase JP Nagar',1000, 2, 2)
[318]: 83.49904676965245
[320]: predict_price('1st Phase JP Nagar',1000, 3, 3)
[320]: 86.80519394990591
```

```
[322]: predict_price('Indira Nagar',1000, 2, 2)
[322]: 181.27815484010569
[324]: predict_price('Indira Nagar',1000, 3, 3)
[324]: 184.5843020203592

8.6 Export the tested model to a pickle file
[267]: import pickle
  with open('Bengaluru_home_price_prediction.pickle','wb') as f:
        pickle.dump(lr,f)
```

8.7 Export location and column information to a file that will be useful later on in our prediction application

```
[269]: import json
    columns = {
        'data_columns' : [col.lower() for col in X.columns]
}
    with open("columns.json","w") as f:
        f.write(json.dumps(columns))
[]:
```

[]: