

DAP --> DATA ANALYSIS PROCESS

1. Problem Finding
2. Data wrangling
 - 2.1 Data Gathering (csv ,xlsx ,db ,api)
 - 2.2 Data Assessing
 - 2.3 Data Preprocessing
3. EDA --> Exploratory Data Analysis ---> Visualise Data, Statistical Methods
4. Reporting , Conclusions, Summary, Advisories
5. Dashboarding --> Power Bi and Tableau

```
# importing major libraries
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
import plotly.express as px

# additional libraries
import warnings
warnings.filterwarnings('ignore')

# importing dataset
df = pd.read_csv('Magicbricks.csv')
```

Data Assessing

About Company

- Magicbricks is India's leading online real estate platform that connects property buyers, sellers, and renters. It offers verified listings, market insights, price trends, and smart tools to help users make informed property decisions. Magicbricks simplifies property search by providing trusted information, advanced filters, and expert guidance across residential and commercial real estate markets.

```
# overview data
df.head()

   Area  BHK  Bathroom Furnishing      Location      District \
0  950.0    2        2.0  Furnished  Karol Bagh  Central Delhi
1  535.0    2        1.0  Furnished  Karol Bagh  Central Delhi
2 1280.0    3        3.0  Furnished  Karol Bagh  Central Delhi
3 1135.0    3        3.0  Furnished  Karol Bagh  Central Delhi
4 1135.0    3        3.0  Furnished  Karol Bagh  Central Delhi

                                         Locality  Parking
Status \
0  DDA MIG Flats Prasad Nagar Phase 2, Prasad Nag...          1.0
```

```

Ready_to_move
1                               Dev Nagar, Karol Bagh    1.0
Ready_to_move
2                               Karol Bagh        2.0
Ready_to_move
3           The Amaryllis, Karol Bagh    2.0
Almost_ready
4           The Amaryllis, Karol Bagh    2.0
Almost_ready

      Transaction      Type  Per_Sqft      Price
0       Resale   Apartment    8761.0  12500000
1  New_Property  Apartment    7290.0   3900000
2       Resale  Builder_Floor  14092.0  15000000
3       Resale   Apartment   22222.0  25000000
4       Resale   Apartment   22222.0  25000000

```

```

#shape
df.shape
(1214, 13)

df.columns
Index(['Area', 'BHK', 'Bathroom', 'Furnishing', 'Location',
       'District',
       'Locality', 'Parking', 'Status', 'Transaction', 'Type',
       'Per_Sqft',
       'Price'],
      dtype='object')

```

□ Data Card: MagicBricks Property Dataset (Sample)

Dataset Name

MagicBricks Residential Property Listings – Sample Data

Dataset Description

This dataset is a **sample of residential property listings** sourced from MagicBricks. It contains structured information about apartments and builder floors in **Karol Bagh, Central Delhi**, including property size, configuration, furnishing status, price, and transaction details.

Number of Records

- 5 property listings
-

Number of Features

- 14 attributes
-

Feature Description

Column Name	Description
Area	Built-up area of the property (in sq. ft.)
BHK	Number of bedrooms
Bathroom	Number of bathrooms
Furnishing	Furnishing status (Furnished)
Location	Area name
District	Administrative district
Locality	Specific locality or project name
Parking	Number of parking spaces
Status	Property possession status
Transaction	Transaction type (Resale / New Property)
Type	Property type (Apartment / Builder Floor)
Per_Sqft	Price per square foot
Price	Total property price
Index	Row identifier

□ Types of Data Errors

1. Completeness Errors

- Occur when **required data is missing**
- Values may be **NULL**, blank, or not recorded

Examples:

- Missing age of a customer
 - Empty salary field
 - Address not provided
-

2. Validity Errors

- Occur when data **does not follow defined rules, constraints, or data types**

Examples:

- Number of children stored as **float** instead of **integer**

- Duplicate values in a unique column (e.g., `patient_id`)
 - Salary recorded as `-10000`
 - Age recorded as a negative value
-

3. Accuracy Errors

- Data is **technically valid** but **factually incorrect or unrealistic**

Examples:

- Body weight of an adult recorded as `13 kg`
 - Age recorded as `200 years`
 - Height recorded as `20 cm` for an adult
-

4. Inconsistency Errors

- Same information stored in **different formats or representations**

Examples:

- `New York City, NYC, NewYork`
 - Name variations: `Gaurav → Gauri`
 - Gender stored as `M, Male, male`
-

□ Summary Table

Error Type	Description	Example
Completeness	Missing data	<code>Age = NULL</code>
Validity	Rule or datatype violation	<code>Salary = -10000</code>
Accuracy	Unrealistic values	<code>Age = 200</code>
Inconsistency	Multiple formats	<code>NYC vs New York City</code>

□ Types of Data

1. Dirty Data

Data with **quality issues**.

- **Completeness** – missing values
 - **Validity** – wrong data type, negative age/salary
 - **Accuracy** – unrealistic values (age = 200, adult weight = 13 kg)
 - **Inconsistency** – same data in different formats (NYC / New York City)
-

2. Messy Data

Data with **structural issues**.

- **Pivoted structure** (months as columns)
 - **Sparcity issue** (too many NULLs)
 - **Wide tables**
-

□ Key Point

- **Dirty Data → value problems**
 - **Messy Data → structure problems**
-

```
# Seaking Information
df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1214 entries, 0 to 1213
Data columns (total 13 columns):
 #   Column      Non-Null Count  Dtype  
--- 
 0   Area         1214 non-null    float64
 1   BHK          1214 non-null    int64  
 2   Bathroom     1212 non-null    float64
 3   Furnishing   1214 non-null    object  
 4   Location     1214 non-null    object  
 5   District     1214 non-null    object  
 6   Locality     1214 non-null    object  
 7   Parking       1182 non-null    float64
 8   Status        1214 non-null    object  
 9   Transaction   1214 non-null    object  
 10  Type          1209 non-null    object  
 11  Per_Sqft     973 non-null    float64
 12  Price         1214 non-null    int64  
dtypes: float64(4), int64(2), object(7)
memory usage: 123.4+ KB
```

□ Data Quality Observations

- The dataset contains **null (missing) values**.
 - **Bathroom** is stored as a **float**, which is a **validity issue** since it should be an integer.
 - **Parking** is also stored as a **float**, indicating a **data type validity issue**.
 - The dataset consists of **6 numerical features** and **7 categorical (object) features**.
-

```
# Seeking description
df.describe()
```

	Area	BHK	Bathroom	Parking
Per_Sqft \				
count	1214.000000	1214.000000	1212.000000	1182.000000
973.000000				
mean	1451.850751	2.778418	2.523927	1.708122
15574.885920				
std	1586.472855	0.946811	1.017723	5.717177
21574.389007				
min	28.000000	1.000000	1.000000	1.000000
1259.000000				
25%	800.000000	2.000000	2.000000	1.000000
6154.000000				
50%	1150.000000	3.000000	2.000000	1.000000
10838.000000				
75%	1620.000000	3.000000	3.000000	2.000000
17647.000000				
max	24300.000000	10.000000	7.000000	114.000000
183333.000000				
Price				
count	1.214000e+03			
mean	2.079898e+07			
std	2.561308e+07			
min	1.000000e+06			
25%	5.600000e+06			
50%	1.400000e+07			
75%	2.500000e+07			
max	2.400000e+08			

- **Accuracy issues identified in the dataset:**
 - The **Area** column shows extreme values, with a minimum of **28 sq ft** and a maximum of **24,300 sq ft**, which requires validation.
 - Properties with **10 BHK** need to be reviewed, as such configurations are rare and may be data entry errors.
 - A record showing **114 parking spaces** is highly unrealistic and indicates a possible accuracy issue.
- House prices range from **₹10 lakh to ₹24 crore**

```
# Completeness
df.isnull().sum().sum()
# Percentage
df.isnull().mean()*100

Area          0.000000
BHK           0.000000
Bathroom      0.164745
Furnishing    0.000000
Location      0.000000
```

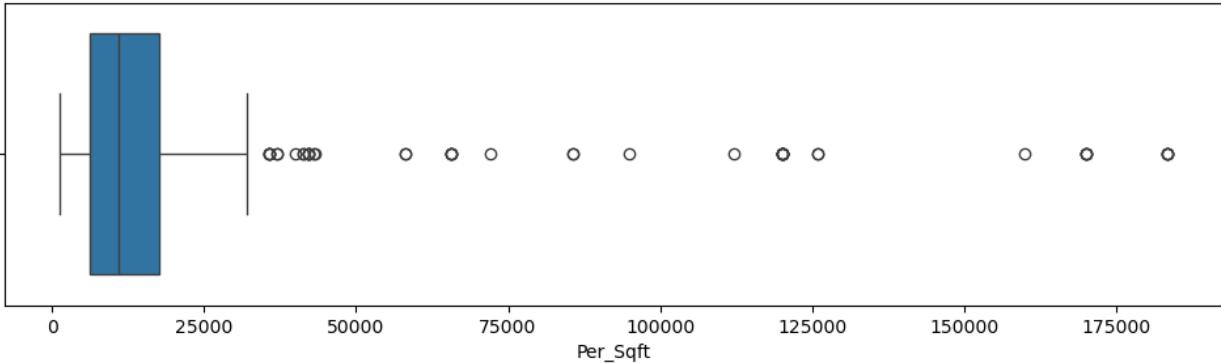
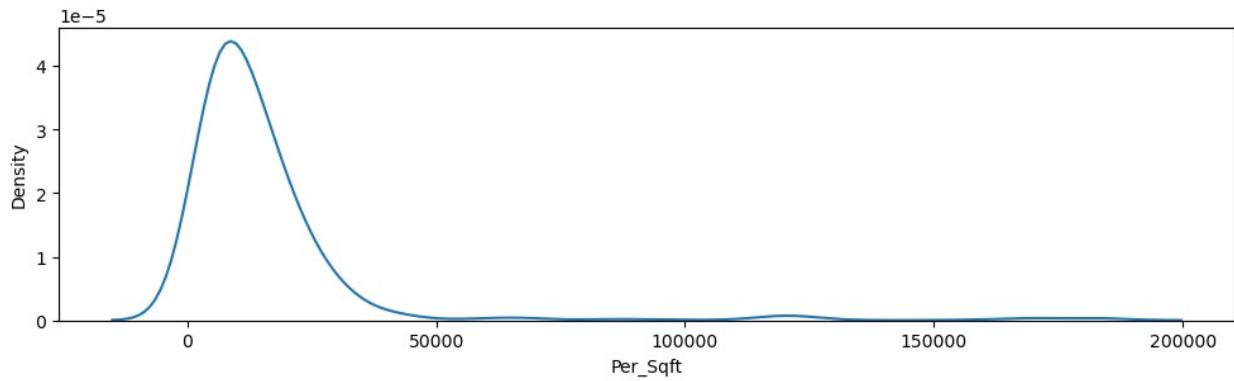
```

District          0.000000
Locality         0.000000
Parking          2.635914
Status           0.000000
Transaction      0.000000
Type             0.411862
Per_Sqft         19.851730
Price            0.000000
dtype: float64

df.Per_Sqft.describe()
# Visualisation
plt.figure(figsize=(12,3))
sns.kdeplot(data=df,x='Per_Sqft')
plt.show()
plt.figure(figsize=(12,3))
sns.boxplot(data=df,x='Per_Sqft')
plt.show()

print('skewness',df.Per_Sqft.skew())

```



```

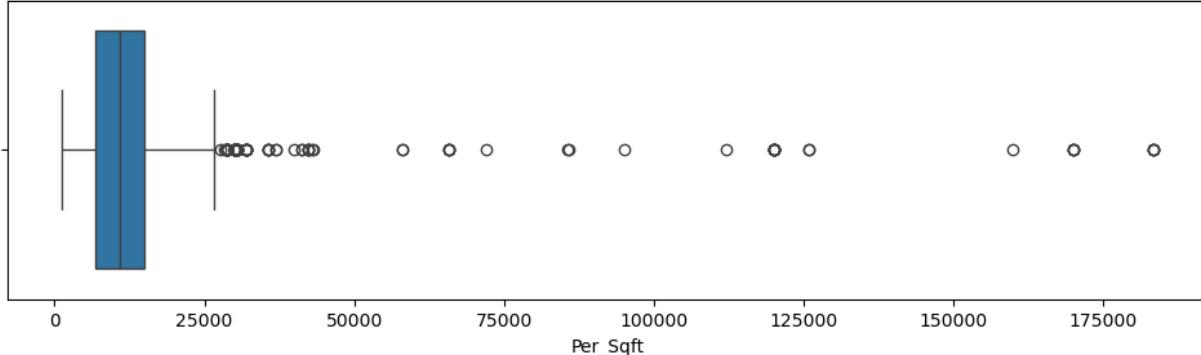
skewness 5.264871991245157

plt.figure(figsize=(12,3))
plt.title('Imputing Per_Sqft with median will raise the number of

```

```
Outliers since, the %age of missing values is almost 20% ')
sns.boxplot(x=df.Per_Sqft.fillna(df.Per_Sqft.median()))
plt.show()
```

Imputing Per_Sqft with median will raise the number of Outliers since, the %age of missing values is almost 20%



```
df.columns
```

```
Index(['Area', 'BHK', 'Bathroom', 'Furnishing', 'Location',
'District',
       'Locality', 'Parking', 'Status', 'Transaction', 'Type',
'Per_Sqft',
       'Price'],
      dtype='object')
```

```
# 'Area' --> 'Price'
# 'Per_Sqft' --> Price/Area
```

```
df.Per_Sqft = df.Per_Sqft.fillna(df.Price/df.Area)
```

```
df.Per_Sqft.isnull().sum()
# df.Per_Sqft is free from issue of completeness
```

```
np.int64(0)
```

```
df.isnull().sum()
df.isnull().mean()*100
```

Area	0.000000
BHK	0.000000
Bathroom	0.164745
Furnishing	0.000000
Location	0.000000
District	0.000000
Locality	0.000000
Parking	2.635914
Status	0.000000
Transaction	0.000000
Type	0.411862
Per_Sqft	0.000000

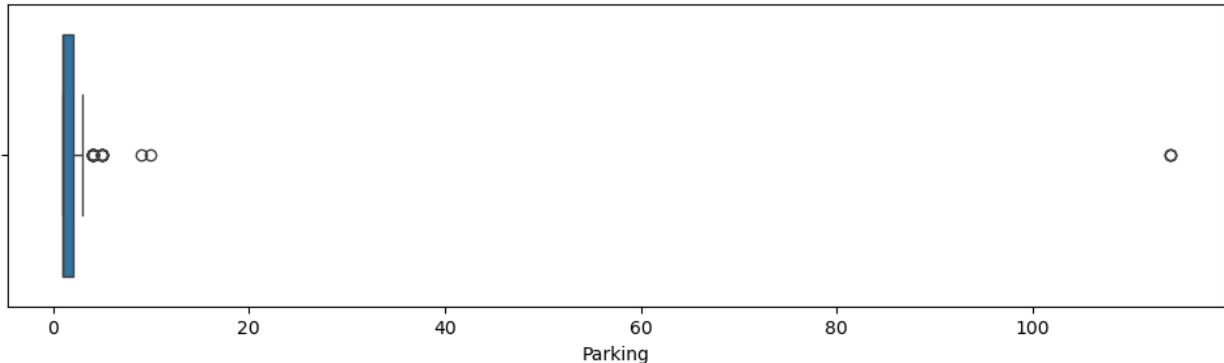
```

Price          0.000000
dtype: float64

# outlier
plt.figure(figsize=(12,3))
plt.title('Boxplot suggests Heave Presence of Outliers')
sns.boxplot(x=df.Parking)
plt.show()

```

Boxplot suggests Heave Presence of Outliers

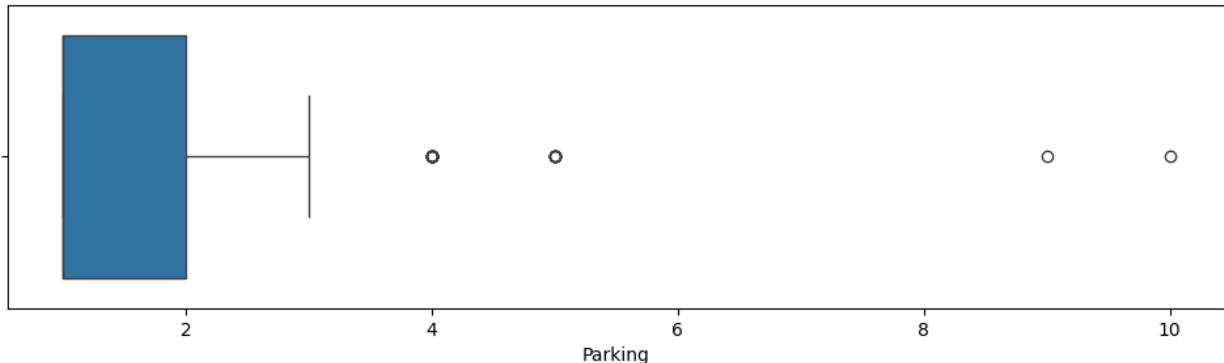


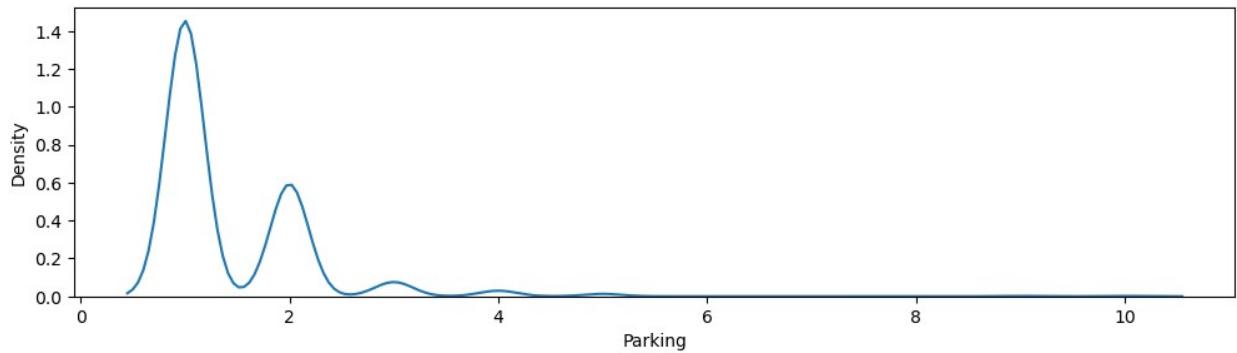
```

df[df.Parking>100]
df.Parking = np.where(df.Parking>100,1,df.Parking)

plt.figure(figsize=(12,3))
sns.boxplot(x=df.Parking)
plt.show()
plt.figure(figsize=(12,3))
sns.kdeplot(x=df.Parking)
plt.show()
df.Parking.skew()

```



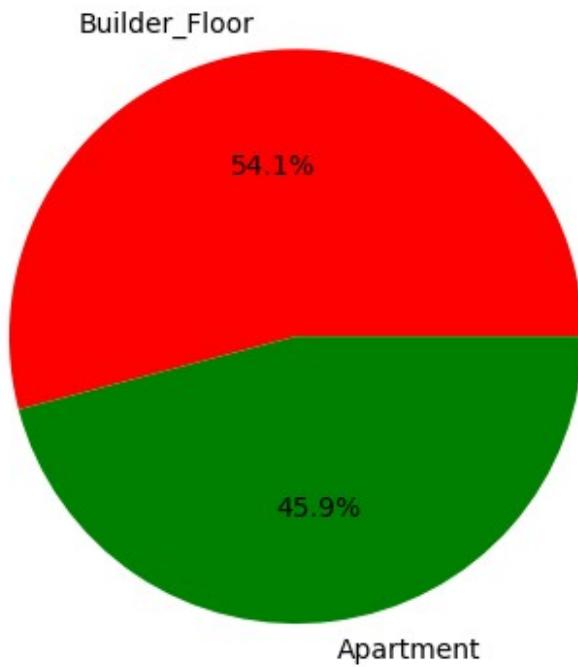


```
np.float64(3.5598955904673226)

df.Parking = df.Parking.fillna(1)
df.Parking = df.Parking.astype(int)
df.Parking.sample(5)

1085    1
876     1
230     1
219     1
1054    1
Name: Parking, dtype: int64

#Type
df.isnull().sum()
colors = ["r","g"]
temp=df.Type.value_counts().reset_index()
plt.pie(temp['count'],labels=temp.Type,autopct='%.1f%'
%,colors=colors)
plt.show()
temp
```



```
Type    count
0  Builder_Floor    654
1      Apartment     555
```

```
df.Type.fillna('Builder_Floor',inplace=True)
df.Type.mode().values
```

```
array(['Builder_Floor'], dtype=object)
```

```
df.isnull().sum()
```

```
Area          0
BHK           0
Bathroom      2
Furnishing    0
Location       0
District       0
Locality       0
Parking        0
Status         0
Transaction    0
Type           0
Per_Sqft       0
Price          0
dtype: int64
```

```
df.dropna(inplace=True)
```

```

df.shape
(1212, 13)

# numerical columns
# categorical columns
df.columns
num=list(df.describe().columns)
cat=[]
for i in df.columns:
    if i not in num:
        cat.append(i)

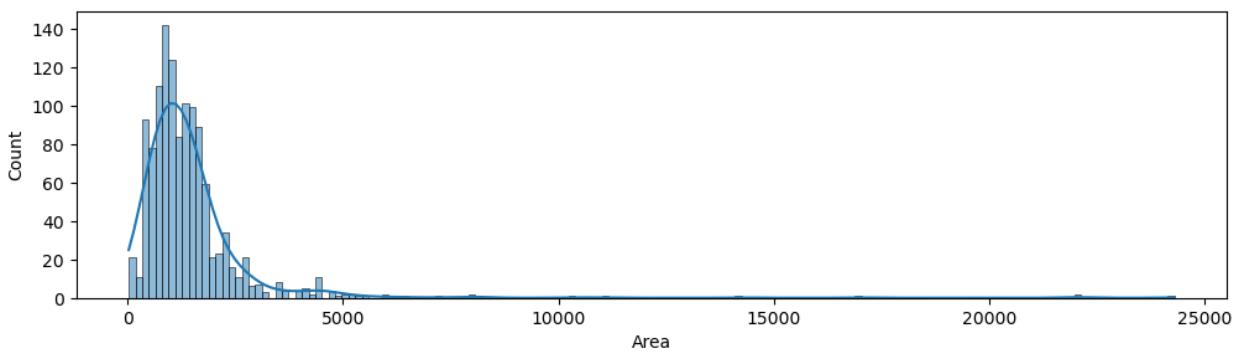
print('numerical\t',num)
print('categorical\t',cat)

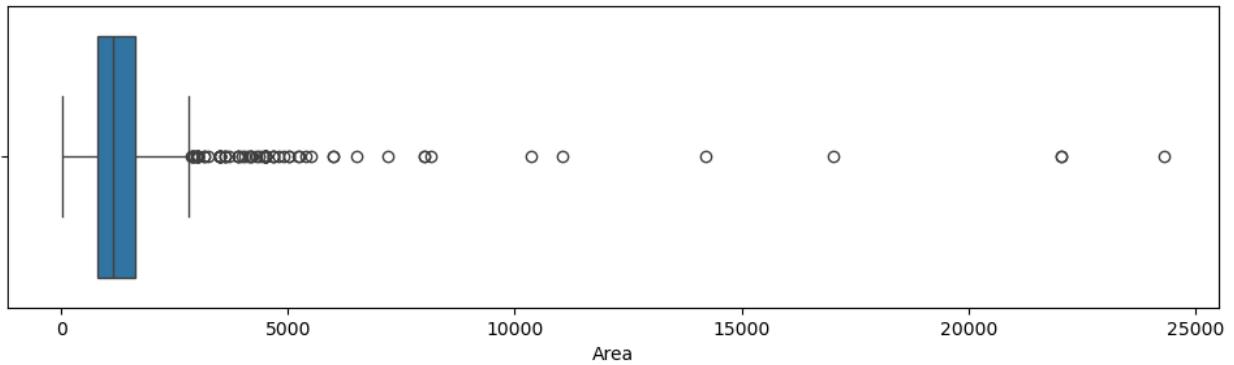
numerical  ['Area', 'BHK', 'Bathroom', 'Parking', 'Per_Sqft',
'Price']
categorical ['Furnishing', 'Location', 'District', 'Locality',
'Status', 'Transaction', 'Type']

# Univariate Analysis
# Numerical columns
# Distribution
plt.figure(figsize=(12,3))
sns.histplot(df.Area,kde=True)
plt.show()

plt.figure(figsize=(12,3))
sns.boxplot(x=df.Area)
plt.show()
df.Area.skew()

```

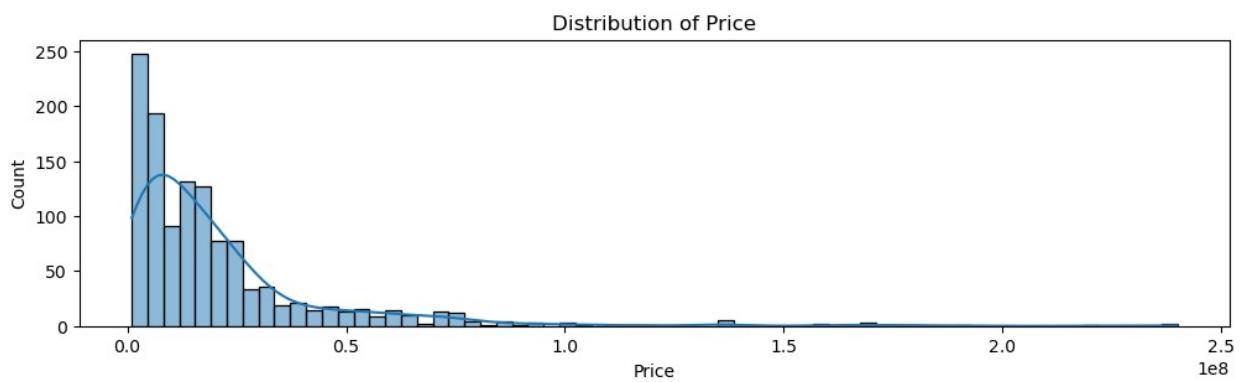




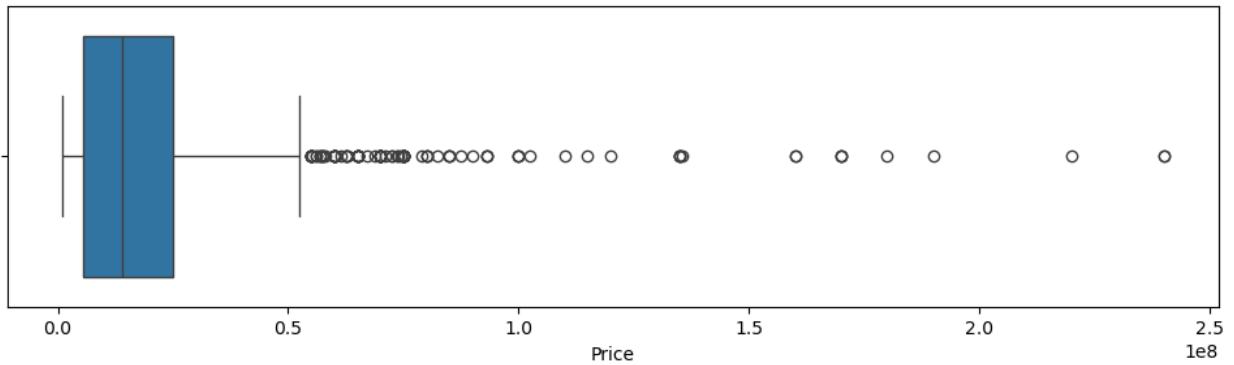
```
np.float64(8.099780784747038)
```

```
# Price
plt.figure(figsize=(12,3))
plt.title('Distribution of Price')
sns.histplot(df.Price,kde=True)
plt.show()

plt.figure(figsize=(12,3))
plt.title('Presence of Outliers')
sns.boxplot(x=df.Price)
plt.show()
df.Area.skew()
```



Presence of Outliers

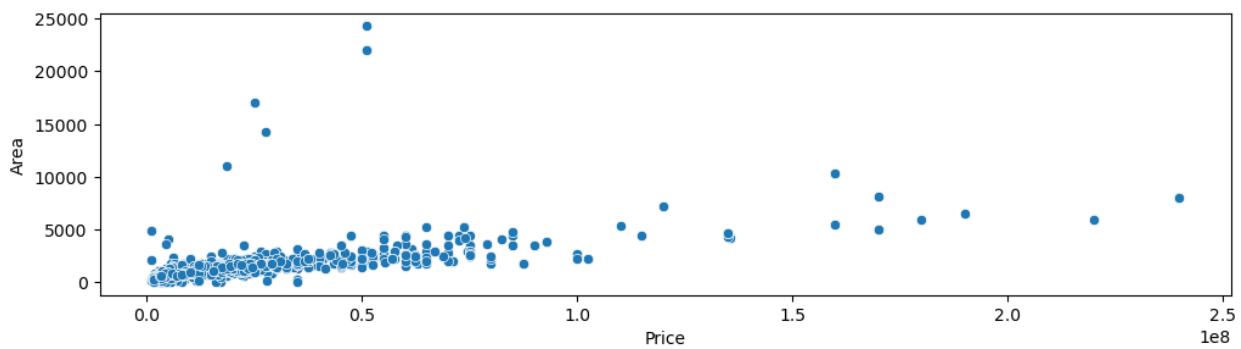


```

np.float64(8.099780784747038)

#Bivariate analysis
plt.figure(figsize=(12,3))
sns.scatterplot(data=df,x='Price',y='Area')
plt.show()

```



Potential Issue:

Areas above 10,000 sq. ft. are shown as very affordable, which is unrealistic for a Delhi-based location.

	Area	BHK	Bathroom	Furnishing	Location		
District \ Transaction	Area	BHK	Bathroom	Furnishing	Locality	Parking	Status
429 New_Property	22050.0	4	4.0	Semi-Furnished	Greater Kailash 1	2	Almost_ready
431 New_Property	22050.0	4	4.0	Semi-Furnished	Greater Kailash 1	2	Almost_ready
515 New_Property	10350.0	4	7.0	Semi-Furnished	Friends Colony	3	Ready_to_move
603 New_Property	24300.0	4	5.0	Semi-Furnished	Saket	South	
806 New_Property	14220.0	3	3.0	Semi-Furnished	Paschim Vihar	West	
835 New_Property	17010.0	3	3.0	Semi-Furnished	Punjabi Bagh	West	
978 New_Property	11050.0	3	3.0	Unfurnished	Chittaranjan Park	South	

```

New_Property
603 Saket 2 Ready_to_move
Resale
806 Paschim Vihar Block B4 1 Ready_to_move
New_Property
835 Punjabi Bagh West 2 Ready_to_move
Resale
978 Chittaranjan Park 1 Ready_to_move
New_Property

```

	Type	Per_Sqft	Price
429	Builder_Floor	30556.0	51000000
431	Builder_Floor	30556.0	51000000
515	Apartment	15459.0	160000000
603	Builder_Floor	12500.0	51000000
806	Builder_Floor	10943.0	27500000
835	Builder_Floor	15278.0	25000000
978	Builder_Floor	12916.0	18500000

22050.0*30556.0

673759800.0

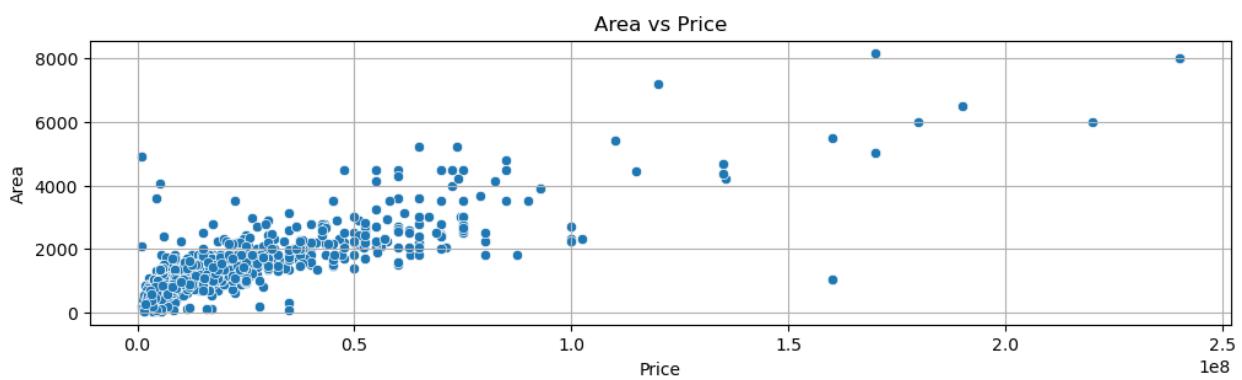
(673759800.0/51000000)/10

1.3210976470588236

```
df.Area = np.where(df.Area>10000,df.Area/10,df.Area)
```

#Bivariate analysis

```
plt.figure(figsize=(12,3))
plt.title('Area vs Price')
sns.scatterplot(data=df,x='Price',y='Area')
plt.grid()
plt.show()
```



2900000, 13500000, 17800000, 13200000, 17500000, 12700000, 13500000, 17400000, 17800000, 12700000, 16200000, 11100000, 13600000, 12500000, 13600000, 1850000, 21000000, 9000000, 6800000, 16000000, 24000000, 51000000, 51000000, 500000, 2350000, 6000000, 2000000, 4000000, 7500000, 15800000, 19200000, 1580000, 15000000, 4600000, 12600000, 25000000, 17200000, 16500000, 18000000, 5800000, 31500000, 31500000, 16200000, 14900000, 27500000, 19500000, 14200000, 1500000, 24500000, 30000000, 5000000, 5000000, 8200000, 7400000, 10400000, 2750000, 35000000, 75100000, 21000000, 4370000, 4370000, 4370000, 6540000, 6800000, 7000000, 10000000, 20000000, 5500000, 14500000, 24000000, 25500000, 18500000, 39700000, 22000000, 25500000, 17000000, 27500000, 25500000, 20000000, 2090000, 43100000, 10500000, 11600000, 3600000, 4950000, 7000000, 3800000, 9800000, 2400000, 1700000, 1600000, 1700000, 6500000, 3500000, 13500000, 15000000, 4800000, 7500000, 2600000, 6700000, 9030000, 11000000, 24900000, 2300000, 10000000, 5400000, 6000000, 2600000, 3500000, 7000000, 4500000, 5500000, 2700000, 3700000, 9000000, 6000000, 3500000, 2550000, 12500000, 12000000, 16500000, 8550000, 11500000, 9500000, 7500000, 41000000, 75000000, 16000000, 30000000, 41000000, 12500000, 14500000, 61500000, 27500000, 8000000, 12000000, 9000000, 12000000, 10000000, 14200000, 12000000, 7500000, 4500000, 4000000, 3000000, 1650000, 1400000, 2000000, 3800000, 2000000, 1800000, 3500000, 4000000, 5000000, 5000000, 4700000, 5500000, 2000000, 7300000, 13000000, 11500000, 2800000, 2200000, 4400000, 13500000, 4100000, 12000000, 3500000, 15000000, 17500000, 1900000, 5500000, 10000000, 4700000, 2400000, 3800000, 2300000, 24500000, 10000000, 5500000, 7000000, 6500000, 5000000, 5000000, 11000000, 10500000, 2300000, 25000000, 1700000, 6200000, 6200000, 15000000, 4500000, 15000000, 6500000, 6000000, 7300000, 7600000, 20000000, 4200000, 15500000, 10000000, 5500000, 5000000, 6000000, 13500000, 12500000, 13000000, 13000000, 6200000, 6500000, 7700000, 7000000, 4700000, 12000000, 3310000, 3400000, 7600000, 4500000, 7300000, 6500000, 7500000, 5800000, 4500000, 9000000, 9200000, 11300000, 4500000, 9300000, 6000000, 3800000, 3600000, 5500000, 4100000, 2500000, 35000000, 1950000, 6000000, 6000000, 6400000, 3000000, 6000000, 6500000, 17500000, 14000000, 3000000, 19000000, 1750000, 14000000, 3000000, 19000000, 11500000, 13000000, 11500000, 13000000, 8400000, 60000000, 6000000, 4600000, 15000000, 15000000, 5990000, 25500000, 7090000, 63000000, 6990000, 4400000, 3000000, 2800000, 2500000, 4900000, 7020000, 3500000, 7000000, 4400000, 4500000, 12500000, 8500000, 3000000, 7000000, 4500000, 1600000, 6500000, 3350000, 62500000, 47500000, 14700000, 18000000, 22500000, 22500000, 7500000, 60000000, 40000000, 11500000, 22500000, 28500000, 29000000, 15500000, 16500000, 12500000, 17500000, 22200000, 8910000, 70000000, 70000000, 38500000, 1355000, 37500000, 45000000, 22500000, 22500000, 52500000, 60000000, 74500000, 6250000, 65000000, 57500000, 51000000, 30000000, 51000000, 30000000, 43500000, 8000000, 70000000, 47000000, 27500000, 70000000, 10250000, 180000000, 7100000, 85000000, 56000000, 100000000, 65000000, 47500000, 70000000, 47500000, 4000000, 85000000, 26000000, 35000000, 20000000, 79000000, 17000000, 47500000, 43000000, 51000000, 40000000, 70000000, 51100000, 25500000, 55000000, 26000000, 38000000, 72500000, 65000000, 50000000, 6200000, 13500000, 30000000, 24000000, 0, 240000000, 11500000, 8300000, 26000000, 26000000, 15800000, 14600000, 2600000, 26000000, 14600000, 25500000, 31000000, 22000000, 13400000, 35000000, 22500000, 15500000, 26000000, 26000000, 15800000, 25000000, 16500000, 26000000, 30000000, 2, 1000000, 31500000, 8900000, 37500000, 30000000, 21000000, 30000000, 31500000, 24800000, 35000000, 40000000, 55000000, 32500000, 27500000, 32500000, 45000000, 0, 21000000, 220000000, 50000000, 160000000, 85000000, 120000000, 44000000, 300

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Exploratory Analysis

Univariate analysis

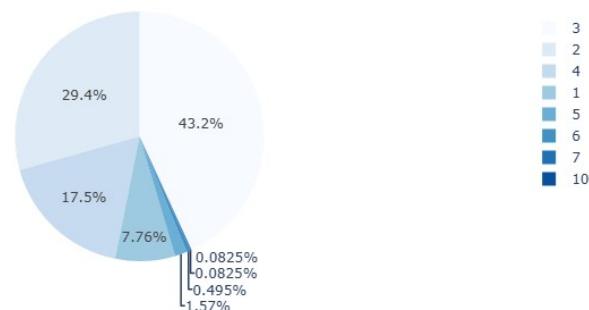
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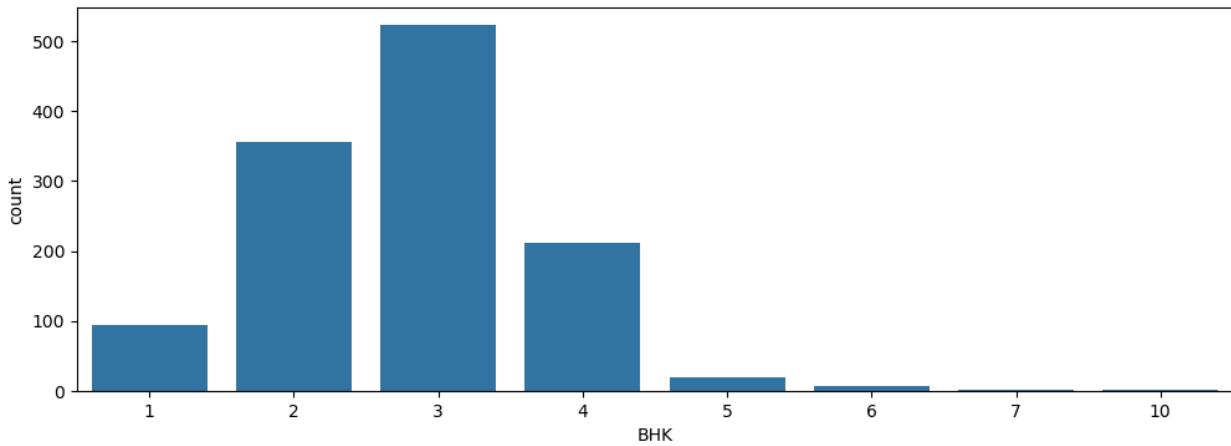
#BHK

```
plt.figure(figsize=(12,4))
sns.countplot(data=df,x='BHK')
temp=df.BHK.value_counts().reset_index()
temp

px.pie(temp,names='BHK',values='count',
       color_discrete_sequence=px.colors.sequential.Blues,
       height=400,title='Distribution of BHK')
# feature egg ---> 5,6,7,10 ---> 4+ BHK Entries
```

Distribution of BHK

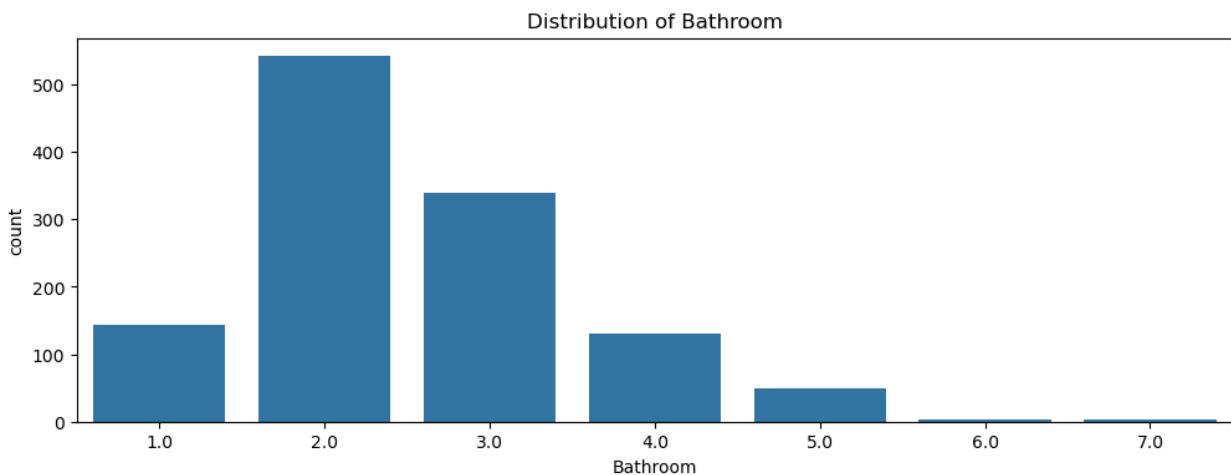




Key Insights

- 3 BHK apartments have the highest number of listings on MagicBricks, indicating strong demand and builder preference.
- 2 BHK units follow closely, driven by affordability and suitability for smaller or nuclear families.
- 4 BHK and 1 BHK configurations show moderate to low availability, reflecting niche demand.
- Very few listings exist for 5, 6, 7, and 10 BHK units, indicating low demand and a more luxury-focused market segment

```
df.Bathroom.value_counts()
plt.figure(figsize=(12,4))
sns.countplot(data=df,x='Bathroom')
plt.title('Distribution of Bathroom')
plt.show()
```

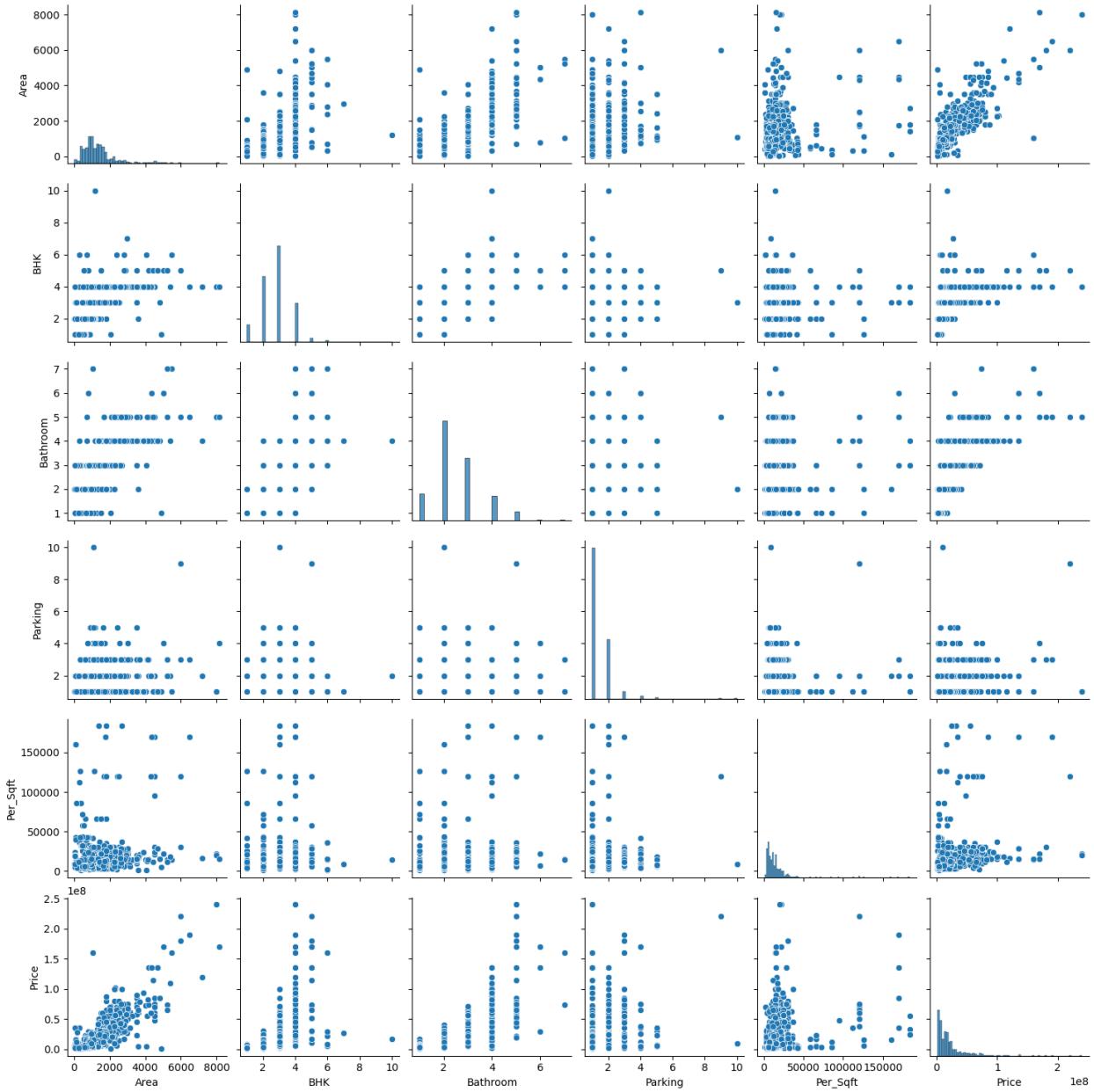


Key Observations

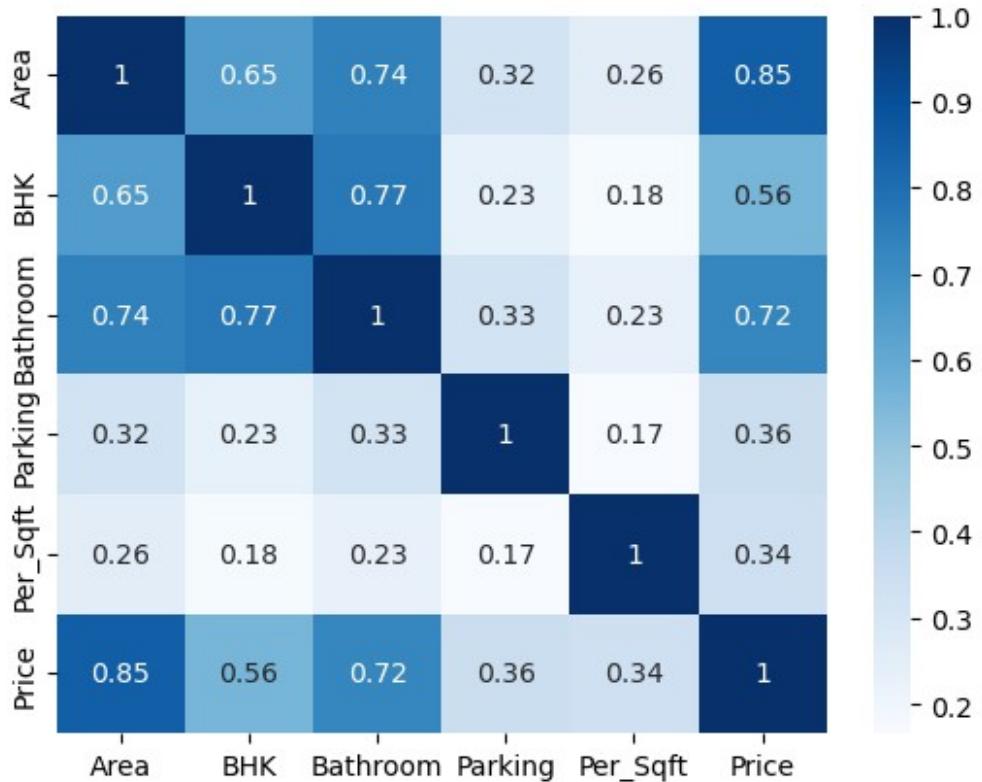
- Properties with 2 bathrooms have the highest number of listings, followed by 3-bathroom configurations, indicating common residential preferences.
- 1-bathroom and 4-bathroom units show almost similar listing counts, suggesting moderate demand.
- 5, 6, and 7 bathroom configurations are extremely rare, reflecting limited availability and niche demand.
- The overall distribution suggests that most listings are apartment-type properties rather than large independent houses.

```
# multivariate analysis
```

```
sns.pairplot(df)  
plt.show()
```



```
# corr
# heat map
sns.heatmap(df.corr(numeric_only=True), cmap="Blues", annot=True)
plt.show()
```



Correlation Insights

- Price and Area** show a very strong positive correlation (**0.84**), indicating that larger properties are priced significantly higher.
- BHK and Bathroom** have strong correlations with both **Area** and **Price**, reflecting that bigger homes generally include more rooms and bathrooms, which increases property value.
- Per Sqft Price and Parking** exhibit weak or negligible correlations with most other variables, suggesting limited influence on overall pricing and property size patterns.

```
df.District.value_counts().reset_index()
```

	District	count
0	South Delhi	457
1	West Delhi	150
2	East Delhi	135
3	North West Delhi	122
4	South West Delhi	95
5	South West Delhi	87
6	Shahdara	75
7	South East Delhi	59
8	Central Delhi	32

```
df.District.unique()
```

```

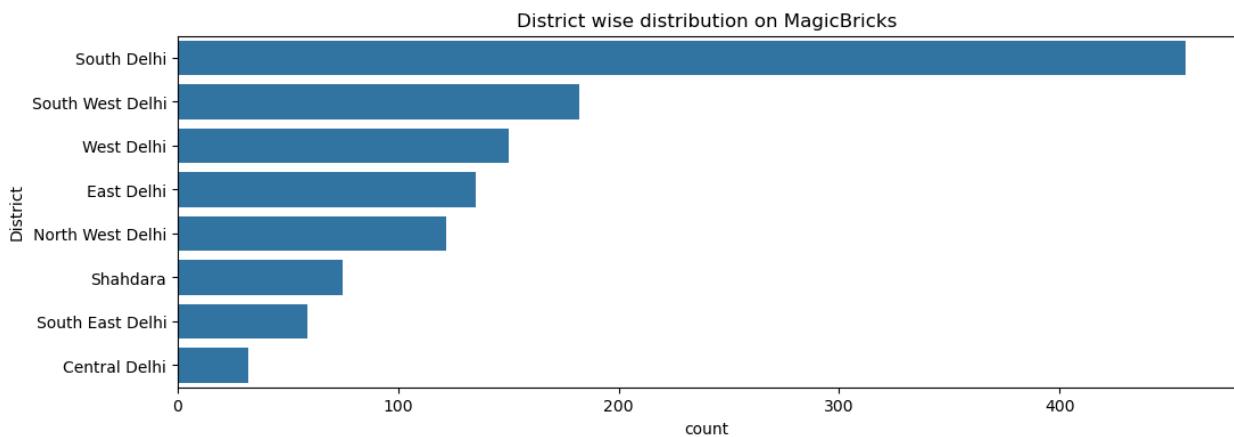
array(['Central Delhi', 'East Delhi', 'North West Delhi', 'Shahdara',
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       'South West Delhi ', 'West Delhi'], dtype=object)

df.District=df.District.str.strip()

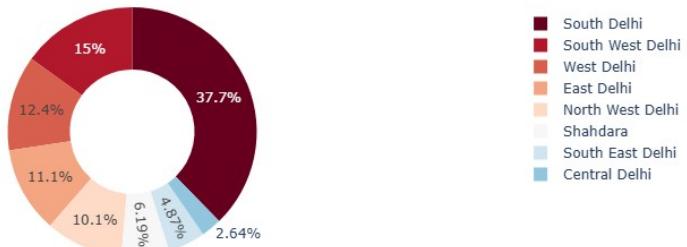
temp=df.District.value_counts().reset_index()
plt.figure(figsize=(12,4))
sns.countplot(data=df,y='District',order=temp.District)
plt.title('District wise distribution on MagicBricks')
plt.show()

px.pie(temp,values='count',names='District',height=400,
       color_discrete_sequence=px.colors.sequential.RdBu, hole=0.5,
       title = 'Distribution of District Listing on
MagicBricks').show()
temp

```



Distribution of District Listing on MagicBricks



	District	count
0	South Delhi	457
1	South West Delhi	182
2	West Delhi	150

3	East Delhi	135
4	North West Delhi	122
5	Shahdara	75
6	South East Delhi	59
7	Central Delhi	32

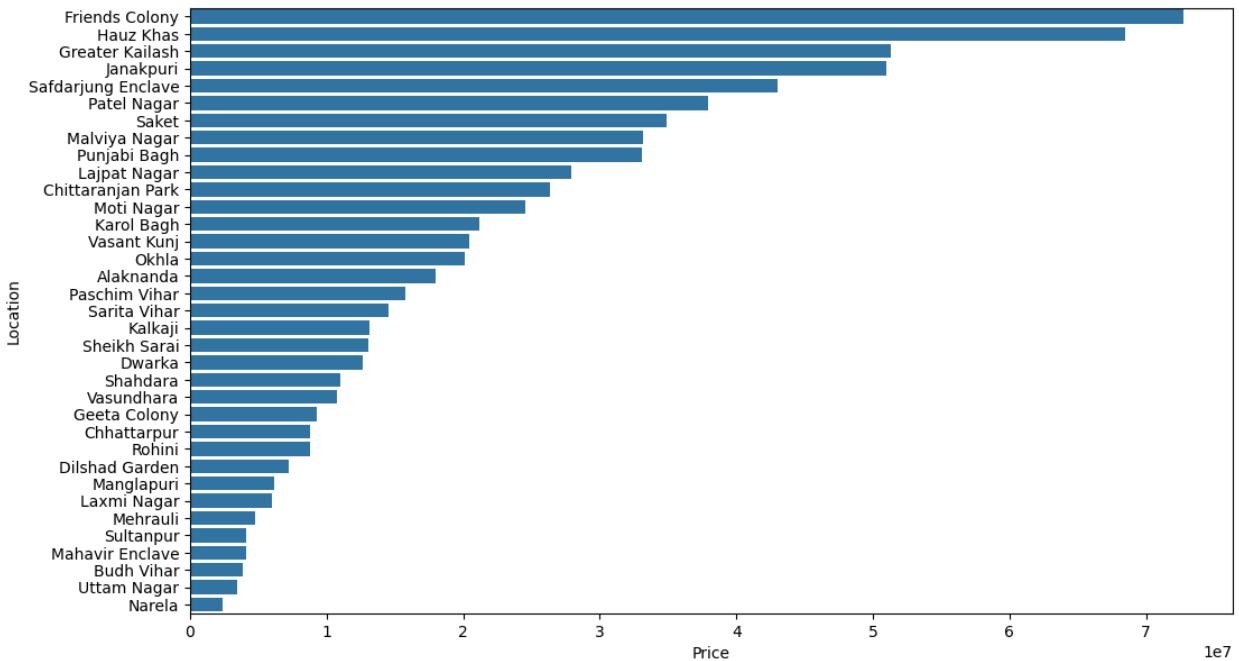
Location-wise Property Listing Analysis

- **South Delhi** records an exceptionally high number of property listings, clearly dominating the market in terms of supply.
- **South West, East, West, and North West Delhi** show comparable listing volumes, each ranging roughly between **100–125 listings**, indicating balanced availability across these regions.
- **Central Delhi** has the lowest number of listings, reflecting limited housing supply in this area.

```
# Location
# price
# bivariate analysis
df.loc[:,['Location','Price']].sample(5)

      Location    Price
358     Alaknanda 14000000
1077    Alaknanda 18500000
1024    Lajpat Nagar 30000000
62      Shahdara  1900000
1157   Paschim Vihar  8600000

temp=df.groupby('Location')
['Price'].mean().sort_values(ascending=False).reset_index()
plt.figure(figsize=(12,7))
sns.barplot(data=df,y='Location',x='Price',
            ci=False,order=temp.Location)
plt.show()
```



Location-wise Property Listing Analysis

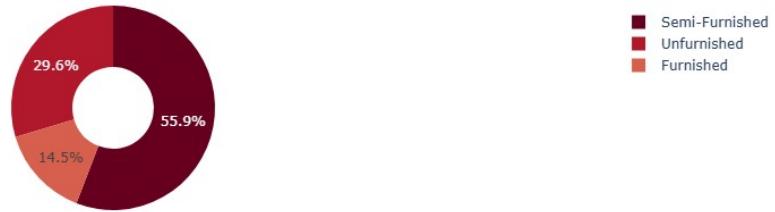
- **Friends Colony** and **Hauz Khas** have the highest number of property listings, indicating strong housing supply and high market activity in these prime locations.
- **Greater Kailash, Janakpuri, and Safdarjung Enclave** also show relatively high listing counts, reflecting consistent demand in well-established residential areas.
- **Mid-range locations** such as Lajpat Nagar, Malviya Nagar, and Karol Bagh display moderate availability, suggesting balanced market conditions.
- **Narela, Uttam Nagar, and Budh Vihar** record the lowest number of listings, indicating limited property supply or lower market participation in these areas.

```
temp=df.Furnishing.value_counts().reset_index()
px.pie(temp,names='Furnishing'
       ,values='count',title='Distribution of Furnishing',hole=0.4,
       color_discrete_sequence=px.colors.sequential.RdBu).show()

temp2= df.groupby('Furnishing')[['Price']].median().reset_index()

px.bar(temp2,x='Price',y='Furnishing',title='Price wise comparision of
Furnishing',
       color_discrete_sequence=px.colors.sequential.RdBu).show()
```

Distribution of Furnishing



Price wise comparision of Furnishing



Furnishing-wise Property Analysis

- **Semi-Furnished properties** dominate the market, accounting for the largest share of listings ($\approx 55.9\%$), indicating strong buyer preference for partially equipped homes.
- **Unfurnished properties** form a significant portion ($\approx 29.6\%$), appealing to buyers who prefer customization or lower upfront costs.
- **Fully Furnished properties** are the least common ($\approx 14.5\%$), suggesting limited supply or higher pricing constraints.
- In terms of price, **Semi-Furnished homes command the highest average prices**, followed by **Furnished**, while **Unfurnished properties** are comparatively more affordable.

```
df.Transaction.value_counts()
colors = ['#1F3A5F', '#2EC4B6'] #deep red, muted blue
sns.countplot(data=df , x='Transaction',hue='Type',palette=colors)
plt.show()
```



Transaction-wise Property Type Analysis

- **Resale properties** are dominated by **Apartments**, indicating higher availability and activity in the secondary housing market.
- **New Property transactions** show a stronger presence of **Builder Floors**, suggesting preference for newly constructed independent-style units.
- Overall, **Apartments are more common in Resale**, while **Builder Floors are more prevalent in New Property listings**, highlighting a clear market segmentation by property type.

Conclusion

This exploratory data analysis reveals clear patterns in Delhi's real estate market. Property prices are strongly influenced by **area, BHK, and number of bathrooms**, confirming that larger and more spacious homes command higher values. **Location plays a crucial role**, with premium areas and South Delhi dominating property listings, while central and peripheral regions show limited supply.

The market shows a strong preference for **semi-furnished properties**, both in availability and pricing, indicating buyer demand for ready-to-move yet customizable homes. Additionally, **transaction type and property type** are closely linked—apartments dominate resale transactions, whereas builder floors are more prevalent in new property listings.

Overall, these insights highlight how **size, location, furnishing, and transaction type** collectively shape pricing and availability, providing a solid foundation for further predictive modeling and decision-making in the real estate domain.

