Data Cleaning and Exploratory Data Analysis

```
In [1]: import pandas as pd
   import numpy as np
   import matplotlib.pyplot as plt
   import seaborn as sns
   #to ignore warnings
   import warnings
   warnings.filterwarnings('ignore')
```

In [3]: data = pd.read_csv("used_cars_data.csv")

In [4]: data.head()

Out[4]:

| | S.No. | Name | Location | Year | Kilometers_Driven | Fuel_Type | Transmission | Owner_Type | Mileage | Engine | Power |
|---|-------|---|------------|------|-------------------|-----------|--------------|------------|---------------|------------|--------------|
| 0 | 0 | Maruti Wagon R LXI CNG | Mumbai | 2010 | 72000 | CNG | Manual | First | 26.6 km/kg | 998 CC | 58.16 bhp |
| 1 | 1 | Hyundai Creta 1.6 CRDi SX Option | Pune | 2015 | 41000 | Diesel | Manual | First | 19.67 kmpl | 1582 CC | 126.2 bhp |
| 2 | 2 | Honda Jazz V | Chennai | 2011 | 46000 | Petrol | Manual | First | 18.2 kmpl | 1199 CC | 88.7 bhp |
| 3 | 3 | Maruti Ertiga VDI | Chennai | 2012 | 87000 | Diesel | Manual | First | 20.77 kmpl | 1248 CC | 88.76 bhp |
| 4 | 4 | Audi A4 New 2.0 TDI Multitronic | Coimbatore | 2013 | 40670 | Diesel | Automatic | Second | 15.2 kmpl | 1968 CC | 140.8 bhp |

In [5]: data.tail()

Out[5]:

| | S.No. | Name | Location | Year | Kilometers_Driven | Fuel_Type | Transmission | Owner_Type | Mileage | Engine | Ро |
|------|-------|---|-----------|------|-------------------|-----------|--------------|------------|---------------|------------|----|
| 7248 | 7248 | Volkswagen Vento Diesel Trendline | Hyderabad | 2011 | 89411 | Diesel | Manual | First | 20.54 kmpl | 1598 CC | 11 |
| 7249 | 7249 | Volkswagen Polo GT TSI | Mumbai | 2015 | 59000 | Petrol | Automatic | First | 17.21 kmpl | 1197 CC | 10 |
| 7250 | 7250 | Nissan Micra Diesel XV | Kolkata | 2012 | 28000 | Diesel | Manual | First | 23.08 kmpl | 1461 CC | (|
| 7251 | 7251 | Volkswagen Polo GT TSI | Pune | 2013 | 52262 | Petrol | Automatic | Third | 17.2 kmpl | 1197 CC | 10 |
| 7252 | 7252 | Mercedes- Benz E- Class 2009- 2013 E 220 CDI Avan | Kochi | 2014 | 72443 | Diesel | Automatic | First | 10.0 kmpl | 2148 CC | |
| 4 | | | | | | | | | | | • |

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 7253 entries, 0 to 7252
Data columns (total 14 columns):
               Non-Null Count Dtype
# Column
                      7253 non-null
    S.No.
                                     int64
                     7253 non-null
1
    Name
                                      object
   Location
                     7253 non-null object
 2
   Year
                     7253 non-null int64
   Kilometers_Driven 7253 non-null int64
 4
 5
   Fuel_Type 7253 non-null object
    Transmission 7253 non-null
Owner_Type 7253 non-null
Mileage 7251 non-null
 6
    Transmission
                                      object
 7
                                      object
 8
   Mileage
                                      object
                     7207 non-null
 9
                                      object
    Engine
                     7207 non-null
10 Power
                                      object
 11 Seats
                     7200 non-null
                                      float64
                     1006 non-null
12 New Price
                                      object
13 Price
                      6019 non-null
                                      float64
dtypes: float64(2), int64(3), object(9)
memory usage: 793.4+ KB
```

Check for Duplication

In [6]: data.info()

```
In [8]: data.nunique()
Out[8]: S.No.
                             7253
                             2041
        Name
                               11
        Location
        Year
                               23
        Kilometers_Driven
                                5
        Fuel_Type
                                2
        Transmission
        Owner_Type
        Mileage
                              450
                              150
        Engine
        Power
                              386
        Seats
                                9
        New_Price
                              625
                             1373
        Price
        dtype: int64
```

Missing Values Calculation

```
In [9]: data.isnull().sum() #to get the number of missing records in each column
Out[9]: S.No.
                                 0
        Name
                                 0
                                 0
        Location
                                0
        Kilometers_Driven
                                0
        Fuel_Type
        Transmission
        Owner_Type
                                0
        Mileage
                                2
        Engine
                               46
        Power
                               46
        Seats
                               53
        New_Price
                             6247
                             1234
        Price
        dtype: int64
```

```
In [10]: (data.isnull().sum()/(len(data)))*100 #percentage of missing values in each column
Out[10]: S.No.
                              0.000000
         Name
                              0.000000
         Location
                              0.000000
         Year
                              0.000000
         Kilometers_Driven
                              0.000000
         Fuel_Type
                              0.000000
         Transmission
                              0.000000
         Owner_Type
                             0.000000
         Mileage
                             0.027575
         Engine
                             0.634220
         Power
                             0.634220
         Seats
                              0.730732
         New Price
                             86.129877
         Price
                             17.013650
         dtype: float64
```

Data Reduction

```
In [11]: # Remove S.No. column from data
          data = data.drop(['S.No.'], axis = 1)
          data.info()
          <class 'pandas.core.frame.DataFrame'>
          RangeIndex: 7253 entries, 0 to 7252
          Data columns (total 13 columns):
                          Non-Null Count Dtype
           # Column
                                   7253 non-null object
           0
               Name
              Location 7253 non-null object
Year 7253 non-null int64
           1
           3 Kilometers_Driven 7253 non-null int64
           4 Fuel_Type 7253 non-null object
             Transmission 7253 non-null object
Owner_Type 7253 non-null object
Mileage 7251 non-null object
Engine 7207 non-null object
Power 7207 non-null object
           5
           6
           7
           8
           9 Power
           10 Seats
                                  7200 non-null float64
           11 New Price
                                 1006 non-null
                                                      object
           12 Price
                                    6019 non-null float64
          dtypes: float64(2), int64(2), object(9)
          memory usage: 736.8+ KB
```

Data Cleaning/Wrangling

```
In [15]: searchfor = ['Isuzu' ,'ISUZU','Mini','Land']
          data[data.Name.str.contains('|'.join(searchfor))].head(5)
Out[15]:
                             Location Year Kilometers_Driven Fuel_Type Transmission Owner_Type Mileage Engine Power So
                     Name
                Land Rover
                                                                                                     12.7
                                                                                                             2179
                                                                                                                    187.7
                    Range
                                 Delhi 2014
                                                       72000
                                                                  Diesel
                                                                            Automatic
                                                                                             First
                 Rover 2.2L
                                                                                                              CC
                                                                                                                     bhp
                                                                                                     kmpl
                      Pure
                Land Rover
                                                                                                      0.0
                                                                                                             2179
                                                                                                                     115
                 Freelander
                                Pune 2012
                                                       85000
                                                                  Diesel
                                                                            Automatic
                                                                                           Second
                                                                                                     kmpl
                                                                                                              CC
                                                                                                                     bhp
                  2 TD4 SE
                      Mini
                                                                                                     16.6
                                                                                                             1998
                                                                                                                     112
           176 Countryman
                                Jaipur 2017
                                                        8525
                                                                  Diesel
                                                                            Automatic
                                                                                           Second
                                                                                                     kmpl
                                                                                                              CC
                                                                                                                     bhp
                  Cooper D
                Land Rover
                    Range
                                                                                                     12.7
                                                                                                             2179
                                                                                                                    187.7
           191
                           Coimbatore 2018
                                                       36091
                                                                            Automatic
                                                                                             First
                                                                  Diesel
                 Rover 2.2L
                                                                                                              CC
                                                                                                                     bhp
                                                                                                     kmpl
                   Dynamic
                Mini Cooper
                                                                                                     16.82
                                                                                                             1998
                                                                                                                  189.08
           228
                Convertible
                                Kochi 2017
                                                       26327
                                                                  Petrol
                                                                            Automatic
                                                                                             First
                                                                                                              CC
                                                                                                     kmpl
                                                                                                                     bhp
In [16]: data["Name"].replace({"ISUZU": "Isuzu", "Mini": "Mini Cooper", "Land Rover"}, inplace=True)
```

Exploratory Data Analysis

In [17]: data.describe()

Out[17]:

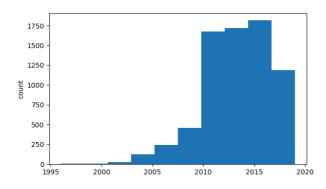
| | Year | Kilometers_Driven | Seats | Price |
|-------|-------------|-------------------|-------------|-------------|
| count | 7253.000000 | 7.253000e+03 | 7200.000000 | 6019.000000 |
| mean | 2013.365366 | 5.869906e+04 | 5.279722 | 9.479468 |
| std | 3.254421 | 8.442772e+04 | 0.811660 | 11.187917 |
| min | 1996.000000 | 1.710000e+02 | 0.000000 | 0.440000 |
| 25% | 2011.000000 | 3.400000e+04 | 5.000000 | 3.500000 |
| 50% | 2014.000000 | 5.341600e+04 | 5.000000 | 5.640000 |
| 75% | 2016.000000 | 7.300000e+04 | 5.000000 | 9.950000 |
| max | 2019.000000 | 6.500000e+06 | 10.000000 | 160.000000 |

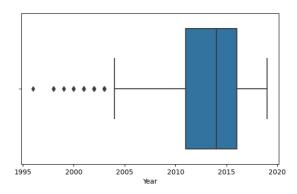
```
In [18]: data.describe(include='all').T
Out[18]:
                             count unique
                                               top
                                                    freq
                                                                mean
                                                                               std
                                                                                      min
                                                                                             25%
                                                                                                     50%
                                                                                                             75%
                                                                                                                        n
                                           Mahindra
                              7253
                                     2041
                      Name
                                           XUV500
                                                      55
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                        Ν
                                           W8 2WD
                   Location
                              7253
                                       11
                                            Mumbai
                                                     949
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                       Ν
                            7253.0
                                                                                   1996.0
                                                                                           2011.0
                                                                                                   2014.0
                                                                                                            2016.0
                                                                                                                      201
                       Year
                                     NaN
                                              NaN
                                                    NaN
                                                          2013.365366
                                                                          3.254421
           Kilometers_Driven
                            7253.0
                                      NaN
                                              NaN
                                                    NaN
                                                         58699.063146 84427.720583
                                                                                    171.0
                                                                                          34000.0 53416.0
                                                                                                          73000.0
                                                                                                                  650000
                  Fuel_Type
                              7253
                                        5
                                             Diesel
                                                    3852
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                        Ν
               Transmission
                              7253
                                        2
                                            Manual
                                                    5204
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                        Ν
                Owner_Type
                              7253
                                        4
                                               First
                                                    5952
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                               17.0
                                                     207
                                                                 NaN
                    Mileage
                              7251
                                      450
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                        ٨
                                              kmpl
                     Engine
                              7207
                                      150
                                           1197 CC
                                                     732
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                     Power
                              7207
                                      386
                                             74 bhp
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                      Seats
                            7200.0
                                      NaN
                                              NaN
                                                    NaN
                                                             5.279722
                                                                           0.81166
                                                                                      0.0
                                                                                              5.0
                                                                                                      5.0
                                                                                                               5.0
                                              63.71
                  New_Price
                              1006
                                      625
                                                       6
                                                                 NaN
                                                                              NaN
                                                                                     NaN
                                                                                             NaN
                                                                                                     NaN
                                                                                                             NaN
                                                                                                                        ٨
                                              Lakh
                                                             9.479468
                                                                          11.187917
                      Price 6019.0
                                      NaN
                                              NaN NaN
                                                                                     0.44
                                                                                              3.5
                                                                                                     5.64
                                                                                                              9.95
                                                                                                                       16
In [19]: #separate Numerical and categorical variables for easy analysis
          cat_cols=data.select_dtypes(include=['object']).columns
          num_cols = data.select_dtypes(include=np.number).columns.tolist()
          print("Categorical Variables:")
          print(cat_cols)
          print("Numerical Variables:")
          print(num_cols)
          Categorical Variables:
          Index(['Name', 'Location', 'Fuel_Type', 'Transmission', 'Owner_Type',
                   'Mileage', 'Engine', 'Power', 'New_Price'],
                 dtype='object')
          Numerical Variables:
          ['Year', 'Kilometers_Driven', 'Seats', 'Price']
```

Univariate Analysis

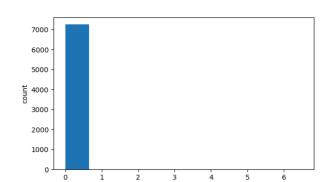
In [20]: #histogram and box plot is used to show the pattern of the variables, as some variables have skewned for col in num_cols:
 print(col)
 print('Skew :', round(data[col].skew(), 2))
 plt.figure(figsize = (15, 4))
 plt.subplot(1, 2, 1)
 data[col].hist(grid=False)
 plt.ylabel('count')
 plt.subplot(1, 2, 2)
 sns.boxplot(x=data[col])
 plt.show()

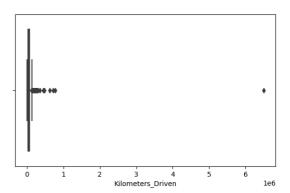
Year Skew : -0.84



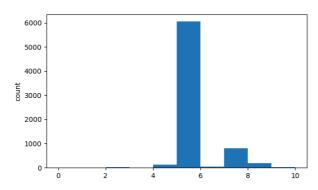


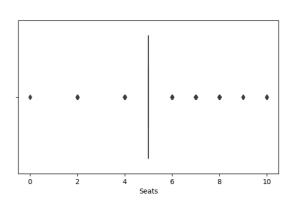
Kilometers_Driven
Skew : 61.58



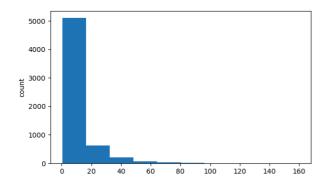


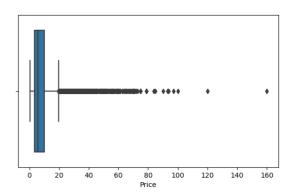
Seats Skew : 1.9



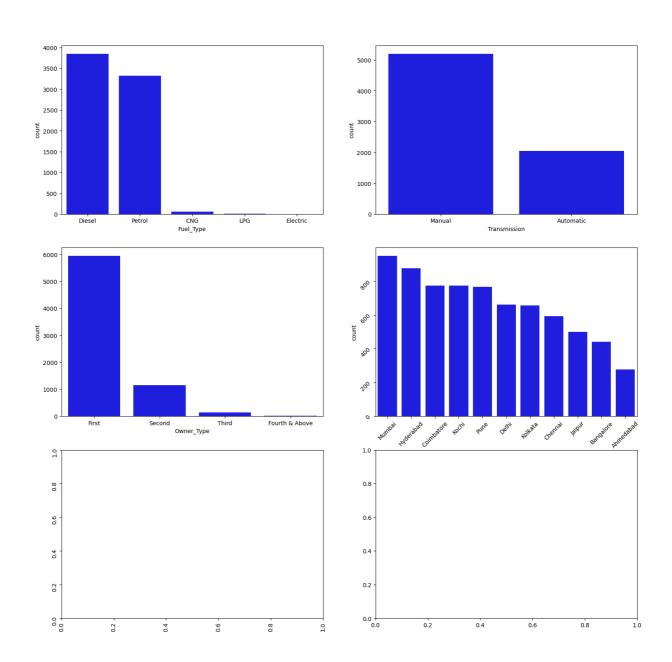


Price Skew : 3.34





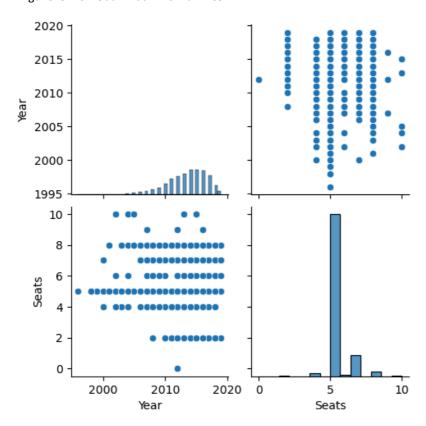
Bar plot for all categorical variables in the dataset



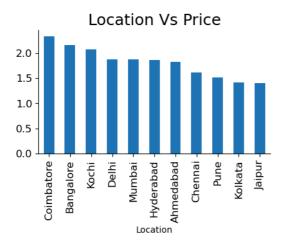
Bivariate Analysis

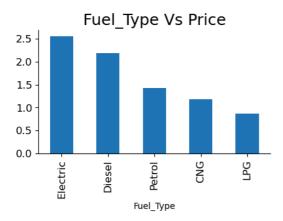
In [28]: # pair plot has been used to show the relationship between two Categorical variables.
plt.figure(figsize=(13,17))
sns.pairplot(data=data.drop(['Kilometers_Driven','Price'],axis=1))
plt.show()

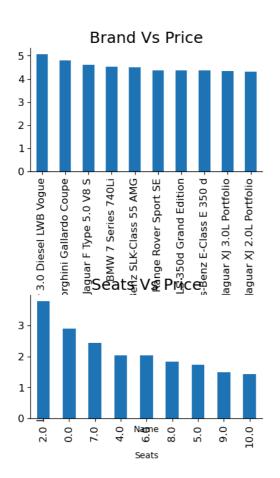
<Figure size 1300x1700 with 0 Axes>

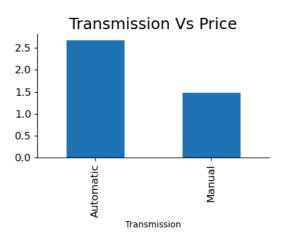


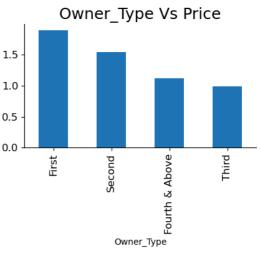
```
In [32]:
         # Preprocessing: Assuming 'Price' is the column for price, let's convert it to logarithmic scale
         data['Price log'] = data['Price'].apply(lambda x: np.log(x))
         # Plotting
         fig, axarr = plt.subplots(4, 2, figsize=(12, 18))
         data.groupby('Location')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[0][0],
         axarr[0][0].set_title("Location Vs Price", fontsize=18)
         data.groupby('Transmission')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[0]
         axarr[0][1].set_title("Transmission Vs Price", fontsize=18)
         data.groupby('Fuel_Type')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[1][0]
         axarr[1][0].set_title("Fuel_Type Vs Price", fontsize=18)
         data.groupby('Owner_Type')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[1][1
         axarr[1][1].set title("Owner Type Vs Price", fontsize=18)
         data.groupby('Name')['Price_log'].mean().sort_values(ascending=False).head(10).plot.bar(ax=axarr[2
         axarr[2][0].set title("Brand Vs Price", fontsize=18)
         data.groupby('Engine')['Price_log'].mean().sort_values(ascending=False).head(10).plot.bar(ax=axarr
         axarr[2][1].set_title("Model Vs Price", fontsize=18)
         data.groupby('Seats')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[3][0], fo
         axarr[3][0].set_title("Seats Vs Price", fontsize=18)
         data.groupby('Year')['Price_log'].mean().sort_values(ascending=False).plot.bar(ax=axarr[3][1], fon
         axarr[3][1].set_title("Year Vs Price", fontsize=18)
         plt.subplots_adjust(hspace=1.0)
         plt.subplots_adjust(wspace=.5)
         sns.despine()
         plt.show()
```











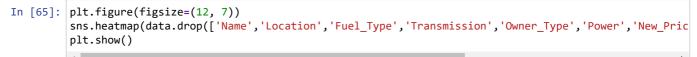




Multivariate Analysis

```
In [55]: data.loc[data["Mileage"]==0.0,'Mileage']=np.nan
    data.Mileage.isnull().sum()
```

Out[55]: 83





In []: