# Laptop\_data\_Regression

July 2, 2024

### 1 Laptop Price Prediction

**Objective:** To develop a predictive model for estimating the price of laptops based on their specifications. By leveraging various supervised machine learning algorithms, we aim to identify the most accurate model for price prediction, providing valuable insights for both consumers and manufacturers in the laptop market.

About the Dataset: The dataset laptop data.csv contains the following columns:

- Unnamed: 0: An index column.
- Company: The brand or manufacturer of the laptop (e.g., Dell, Apple, HP).
- TypeName: The type or category of the laptop (e.g., Ultrabook, Gaming, Notebook).
- Inches: The screen size of the laptop in inches.
- ScreenResolution: The resolution of the laptop screen (e.g., 1920x1080, 1366x768).
- Cpu: The central processing unit (CPU) model and speed of the laptop.
- Ram: The amount of random access memory (RAM) in the laptop, typically measured in GB.
- Memory: The storage capacity and type of the laptop (e.g., 256GB SSD, 1TB HDD).
- Gpu: The graphics processing unit (GPU) model in the laptop.
- OpSys: The operating system installed on the laptop (e.g., Windows, macOS, Linux).
- Weight: The weight of the laptop in kilograms.
- Price: The price of the laptop, which is the target variable for prediction.

#### Significance:

- Consumer Decision-Making: By predicting laptop prices based on specifications, consumers can make more informed purchasing decisions and find the best value for their money.
- Market Analysis: Manufacturers and retailers can use the model to analyze market trends, optimize pricing strategies, and understand the impact of various features on the overall price.
- Product Development: Insights gained from the model can guide manufacturers in designing laptops that meet consumer demands while maintaining competitive pricing.

By implementing and comparing various supervised machine learning algorithms, including Linear Regression, Ridge Regression, Lasso Regression, KNeighborsRegressor, DecisionTreeRegressor, SupportVectorRegressor, RandomForestRegressor, and Adaboost Regressor, we aim to identify the most effective model for accurate laptop price prediction.

#### 1)Import required libraries

```
[3]: import pandas as pd import numpy as np
```

```
import seaborn as sns
import matplotlib.pyplot as plt
from sklearn.preprocessing import LabelEncoder
from sklearn.model_selection import train_test_split
from sklearn.compose import ColumnTransformer
from sklearn.pipeline import Pipeline
from sklearn.preprocessing import OneHotEncoder
from sklearn.metrics import r2_score,mean_absolute_error
from sklearn.linear model import LinearRegression, Ridge, Lasso
from sklearn.neighbors import KNeighborsRegressor
from sklearn.tree import DecisionTreeRegressor
from sklearn.ensemble import RandomForestRegressor, AdaBoostRegressor
from sklearn.svm import SVR
import pickle
import warnings
warnings.filterwarnings('ignore')
```

## 2 Exploratory Data Analysis

#### 2)Read the dataset

```
[91]: df=pd.read_csv('/content/drive/MyDrive/Datasets/laptop_data.csv') df
```

```
TypeName Inches \
[91]:
            Unnamed: O Company
      0
                     0
                         Apple
                                          Ultrabook
                                                       13.3
      1
                         Apple
                                                       13.3
                                          Ultrabook
                            ΗP
                                           Notebook
                                                       15.6
      3
                     3
                         Apple
                                         Ultrabook
                                                     15.4
                     4
                         Apple
                                         Ultrabook
                                                       13.3
      1298
                  1298 Lenovo
                               2 in 1 Convertible
                                                      14.0
      1299
                  1299 Lenovo
                                2 in 1 Convertible
                                                       13.3
      1300
                  1300 Lenovo
                                          Notebook
                                                       14.0
      1301
                  1301
                            ΗP
                                           Notebook
                                                       15.6
      1302
                  1302
                          Asus
                                           Notebook
                                                       15.6
                                       ScreenResolution \
      0
                    IPS Panel Retina Display 2560x1600
      1
                                               1440x900
      2
                                     Full HD 1920x1080
      3
                    IPS Panel Retina Display 2880x1800
      4
                    IPS Panel Retina Display 2560x1600
             IPS Panel Full HD / Touchscreen 1920x1080
      1298
      1299 IPS Panel Quad HD+ / Touchscreen 3200x1800
```

1300 1301 1302	1366x768 1366x768 1366x768							
1302		13002700	O					
		Cpu Rai	m Memory \					
0	Intel Core is	2.3GHz 8G	B 128GB SSD					
1	Intel Core is	1.8GHz 8G	B 128GB Flash Storage					
2	Intel Core i5 72000	2.5GHz 8G	B 256GB SSD					
3	Intel Core i7	2.7GHz 16G	B 512GB SSD					
4	Intel Core is	3.1GHz 8G	B 256GB SSD					
•••		•••	•••					
1298	Intel Core i7 65000							
1299	Intel Core i7 65000							
1300	Intel Celeron Dual Core N3050		O					
1301	Intel Core i7 65000							
1302	Intel Celeron Dual Core N3050	1.6GHz 4G	B 500GB HDD					
	•	0. 0						
•	Gpu	OpSys	Weight Price					
0	Intel Iris Plus Graphics 640	macOS	1.37kg 71378.6832					
1	Intel HD Graphics 6000	macOS	1.34kg 47895.5232					
2	Intel HD Graphics 620	No OS	1.86kg 30636.0000					
3	AMD Radeon Pro 455	macOS	1.83kg 135195.3360					
4	Intel Iris Plus Graphics 650	macOS	1.37kg 96095.8080					
 1298	Intol UD Craphics 520	 Windows 10	 1.8kg 33992.6400					
1290	Intel HD Graphics 520 Intel HD Graphics 520	Windows 10 Windows 10	1.8kg 33992.6400 1.3kg 79866.7200					
1300	Intel HD Graphics 520		1.5kg 12201.1200					
1300	AMD Radeon R5 M330		2.19kg 40705.9200					
1301	Intel HD Graphics	Windows 10	2.2kg 19660.3200					
1002	inter in draphics	WILL GWODILLW	2.2ng 13000.3200					

[1303 rows x 12 columns]

## 3) Statistical Analysis

[92]: df.shape

[92]: (1303, 12)

The dataset contains 1303 rows and 12 columns.

[93]: df.describe()

[93]: Unnamed: 0 Inches Price count 1303.00000 1303.000000 1303.000000 15.017191 mean 651.00000 59870.042910 std 376.28801 1.426304 37243.201786 0.00000 10.100000 9270.720000  ${\tt min}$ 25% 325.50000 14.000000 31914.720000

```
50% 651.00000 15.600000 52054.560000
75% 976.50000 15.600000 79274.246400
max 1302.00000 18.400000 324954.720000
```

#### [94]: df.info()

<class 'pandas.core.frame.DataFrame'>
RangeIndex: 1303 entries, 0 to 1302
Data columns (total 12 columns):

#	Column	Non-Null Count	Dtype
0	Unnamed: 0	1303 non-null	int64
1	Company	1303 non-null	object
2	TypeName	1303 non-null	object
3	Inches	1303 non-null	float64
4	ScreenResolution	1303 non-null	object
5	Cpu	1303 non-null	object
6	Ram	1303 non-null	object
7	Memory	1303 non-null	object
8	Gpu	1303 non-null	object
9	OpSys	1303 non-null	object
10	Weight	1303 non-null	object
11	Price	1303 non-null	float64

dtypes: float64(2), int64(1), object(9)

memory usage: 122.3+ KB

# [95]: # to obtain unique elements in each columns. df.nunique()

[95]:	Unnamed: 0	1303		
	Company	19		
	TypeName	6		
	Inches	18		
	ScreenResolution			
	Cpu	118		
	Ram	9		
	Memory	39		
	Gpu	110		
	OpSys	9		
	Weight	179		
	Price	791		
	dtype: int64			

# 3 Data Cleaning

## 4) Handling Missing Values

```
[96]: # To drop a column
      df.drop(['Unnamed: 0'],axis=1,inplace=True)
      df.drop_duplicates(inplace=True)
      df.reset_index(drop=True,inplace=True)
      df.head()
[96]:
        Company
                  TypeName Inches
                                                       ScreenResolution \
                                    IPS Panel Retina Display 2560x1600
      0
          Apple
                Ultrabook
                              13.3
                              13.3
                                                               1440x900
      1
          Apple
                Ultrabook
                                                      Full HD 1920x1080
      2
             ΗP
                  Notebook
                              15.6
                                    IPS Panel Retina Display 2880x1800
      3
          Apple Ultrabook
                              15.4
          Apple Ultrabook
                                    IPS Panel Retina Display 2560x1600
      4
                              13.3
                                                         Memory \
                                Cpu
                                      Ram
                                      8GB
      0
               Intel Core i5 2.3GHz
                                                      128GB SSD
      1
               Intel Core i5 1.8GHz
                                      8GB 128GB Flash Storage
      2
        Intel Core i5 7200U 2.5GHz
                                      8GB
                                                      256GB SSD
               Intel Core i7 2.7GHz 16GB
      3
                                                      512GB SSD
      4
               Intel Core i5 3.1GHz
                                      8GB
                                                      256GB SSD
                                  Gpu OpSys Weight
                                                             Price
         Intel Iris Plus Graphics 640
                                       macOS 1.37kg
                                                       71378.6832
      1
               Intel HD Graphics 6000
                                       macOS 1.34kg
                                                       47895.5232
      2
                Intel HD Graphics 620
                                       No OS 1.86kg
                                                        30636.0000
      3
                   AMD Radeon Pro 455 macOS 1.83kg 135195.3360
      4 Intel Iris Plus Graphics 650
                                       macOS 1.37kg
                                                        96095.8080
[97]: df.shape
[97]: (1274, 11)
[98]: # To check the missing values
      df.isna().sum()
[98]: Company
                          0
      TypeName
                          0
      Inches
                          0
      ScreenResolution
                          0
                          0
      Cpu
      Ram
                          0
      Memory
                          0
      Gpu
                          0
      OpSys
                          0
      Weight
                          0
      Price
                          0
      dtype: int64
```

There is no missing values in the dataset.

#### 5) Datatype Conversion

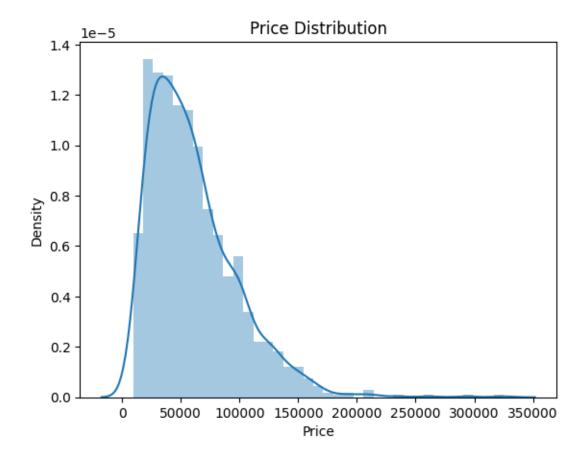
```
[99]: df.dtypes
[99]: Company
                             object
       TypeName
                             object
       Inches
                            float64
       ScreenResolution
                             object
                             object
       Cpu
       Ram
                             object
       Memory
                             object
       Gpu
                             object
       OpSys
                             object
       Weight
                             object
       Price
                            float64
       dtype: object
[100]: #to remove units of Ram and Weight
       df['Ram']=df['Ram'].str.replace('GB',"")
       df['Ram'] = df['Ram'].astype(int)
       df['Weight']=df['Weight'].str.replace('kg',"")
       df['Weight']=df['Weight'].astype(float)
       df.head()
[100]:
         Company
                   TypeName
                              Inches
                                                         ScreenResolution \
                  Ultrabook
                                      IPS Panel Retina Display 2560x1600
           Apple
                                13.3
           Apple
                  Ultrabook
                                13.3
                                                                  1440x900
       1
              ΗP
                                15.6
                                                        Full HD 1920x1080
       2
                   Notebook
       3
           Apple Ultrabook
                                15.4
                                      IPS Panel Retina Display 2880x1800
           Apple
                  Ultrabook
                                13.3
                                      IPS Panel Retina Display 2560x1600
                                  Cpu
                                       Ram
                                                          Memory
       0
                Intel Core i5 2.3GHz
                                                       128GB SSD
                                         8
       1
                Intel Core i5 1.8GHz
                                         8
                                            128GB Flash Storage
       2
          Intel Core i5 7200U 2.5GHz
                                         8
                                                       256GB SSD
                Intel Core i7 2.7GHz
       3
                                        16
                                                       512GB SSD
       4
                Intel Core i5 3.1GHz
                                         8
                                                       256GB SSD
                                    Gpu
                                         OpSys
                                                 Weight
                                                               Price
       0
          Intel Iris Plus Graphics 640
                                         macOS
                                                   1.37
                                                          71378.6832
       1
                Intel HD Graphics 6000
                                                   1.34
                                         macOS
                                                          47895.5232
       2
                 Intel HD Graphics 620
                                         No OS
                                                   1.86
                                                          30636.0000
       3
                    AMD Radeon Pro 455
                                         macOS
                                                   1.83 135195.3360
          Intel Iris Plus Graphics 650
                                         macOS
                                                   1.37
                                                          96095.8080
[101]: df.dtypes
```

```
[101]: Company
                              object
       TypeName
                              object
       Inches
                            float64
       ScreenResolution
                              object
                              object
       Cpu
       Ram
                               int64
       Memory
                              object
       Gpu
                              object
       OpSys
                              object
       Weight
                             float64
       Price
                            float64
       dtype: object
```

#### 6)Data Visualization and Feature Engineering

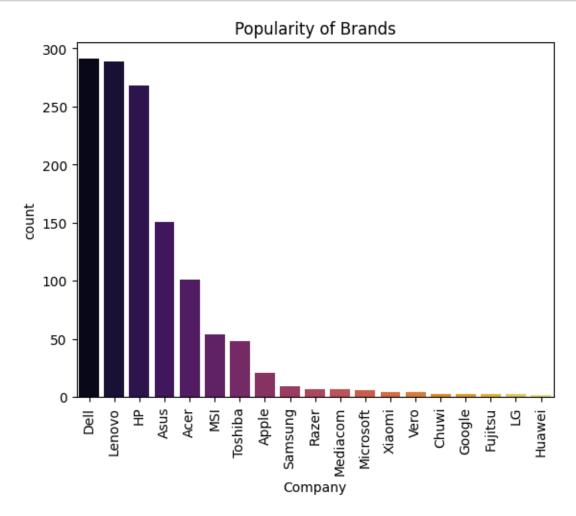
```
[102]: sns.distplot(df['Price'])
plt.title('Price Distribution')
```

[102]: Text(0.5, 1.0, 'Price Distribution')



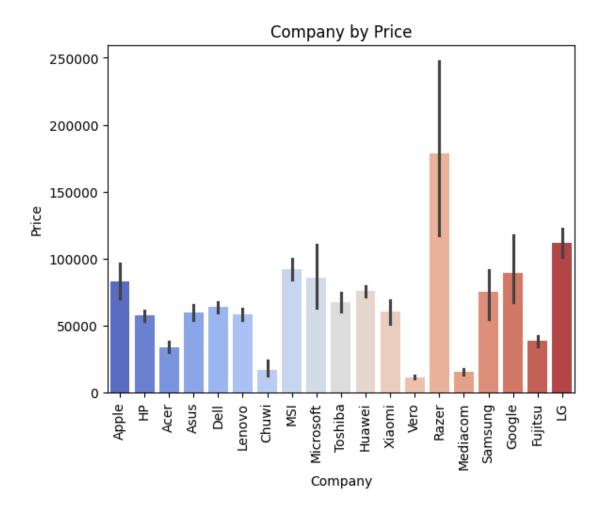
**Insight:** From the distplot, it is clear that the prices in range(0-50000) are more in count.

```
[103]: sns.barplot(df['Company'].value_counts(),palette='inferno')
    plt.xticks(rotation='vertical')
    plt.title('Popularity of Brands')
    plt.show()
```

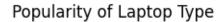


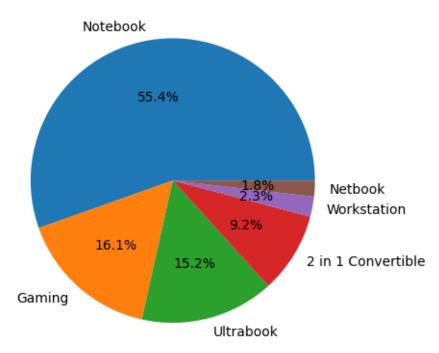
**Insight:** From the barplot, it is evident that majority of the laptops in the dataset are from Dell. Only few number of laptops are of Huawei.

```
[104]: sns.barplot(x=df['Company'],y=df['Price'],palette='coolwarm')
plt.xticks(rotation='vertical')
plt.title('Company by Price')
plt.show()
```



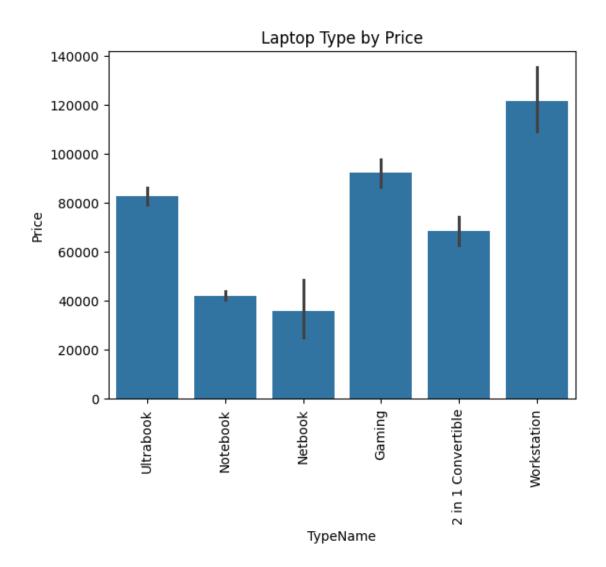
**Insight:** From the barplot, it is clear that Razer laptops are high in price. Whereas Vero brand has low price range.





**Insight:** From the piechart, it is evident that Notebook type of the laptop are more in count and Netbook type laptops are less in count.

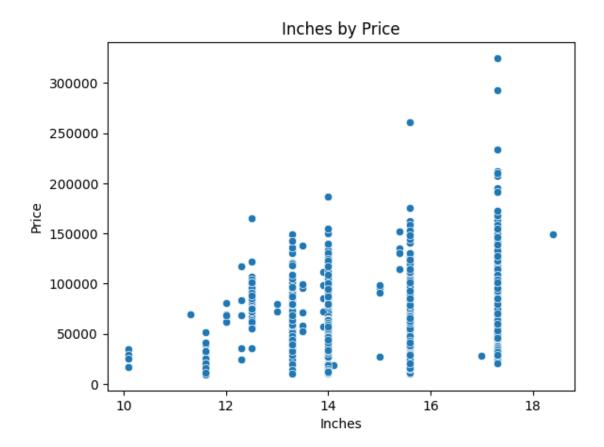
```
[106]: sns.barplot(x=df['TypeName'],y=df['Price'])
  plt.xticks(rotation='vertical')
  plt.title('Laptop Type by Price')
  plt.show()
```



**Insight:** From the barplot, it is clear that Price range is more for Workstation type laptops and less for Netbook type laptops.

```
[107]: sns.scatterplot(x=df['Inches'],y=df['Price'])
plt.title('Inches by Price')
```

[107]: Text(0.5, 1.0, 'Inches by Price')



**Insight:** From the scatterplot, it is clear that inches of range(16-18) have high price range.

[108]: df['ScreenResolution'].value\_counts()

IPS Panel 1366x768

IPS Panel Retina Display 2560x1600

IPS Panel Retina Display 2304x1440

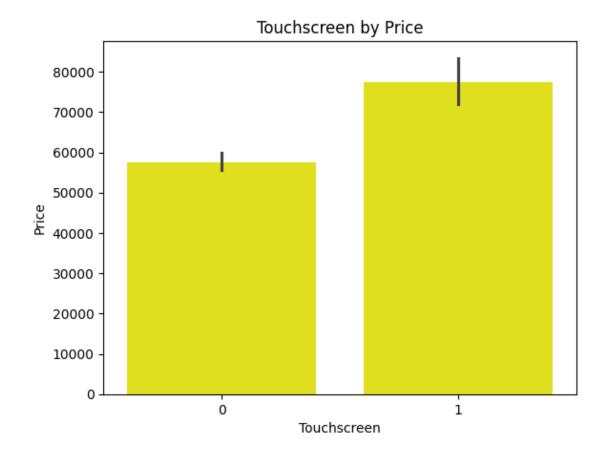
```
[108]: ScreenResolution
       Full HD 1920x1080
                                                          505
       1366x768
                                                          262
       IPS Panel Full HD 1920x1080
                                                          226
       IPS Panel Full HD / Touchscreen 1920x1080
                                                           51
      Full HD / Touchscreen 1920x1080
                                                           47
       1600x900
                                                           23
       Touchscreen 1366x768
                                                           16
       Quad HD+ / Touchscreen 3200x1800
                                                           15
       IPS Panel 4K Ultra HD 3840x2160
                                                           12
       IPS Panel 4K Ultra HD / Touchscreen 3840x2160
                                                           11
       4K Ultra HD / Touchscreen 3840x2160
                                                           10
       4K Ultra HD 3840x2160
                                                            7
       Touchscreen 2560x1440
                                                            7
                                                            7
```

6

6

```
Touchscreen 2256x1504
                                                           6
       IPS Panel Touchscreen 2560x1440
                                                           5
       IPS Panel Quad HD+ / Touchscreen 3200x1800
                                                           4
       IPS Panel Touchscreen 1920x1200
       1440x900
       IPS Panel Retina Display 2880x1800
                                                           4
       IPS Panel 2560x1440
                                                           4
       2560x1440
                                                           3
       Quad HD+ 3200x1800
                                                           3
       1920x1080
                                                           3
      Touchscreen 2400x1600
                                                           3
      IPS Panel Quad HD+ 2560x1440
                                                           3
       IPS Panel Touchscreen 1366x768
                                                           3
       IPS Panel Touchscreen / 4K Ultra HD 3840x2160
                                                           2
       IPS Panel Full HD 2160x1440
                                                           2
                                                           2
       IPS Panel Quad HD+ 3200x1800
       IPS Panel Retina Display 2736x1824
                                                           1
       IPS Panel Full HD 1920x1200
       IPS Panel Full HD 2560x1440
       IPS Panel Full HD 1366x768
      Touchscreen / Full HD 1920x1080
                                                           1
      Touchscreen / Quad HD+ 3200x1800
                                                           1
       Touchscreen / 4K Ultra HD 3840x2160
                                                           1
       IPS Panel Touchscreen 2400x1600
                                                           1
      Name: count, dtype: int64
[110]: df['Touchscreen']=df['ScreenResolution'].apply(lambda x:1 if 'Touchscreen' in x_
       ⇔else 0)
       sns.barplot(x=df['Touchscreen'],y=df['Price'],color='yellow')
       plt.title('Touchscreen by Price')
```

[110]: Text(0.5, 1.0, 'Touchscreen by Price')



**Insight:** From the barchart, it is clear that laptops with touchscreen have high price range.

```
[35]: df['IPS']=df['ScreenResolution'].apply(lambda x:1 if 'IPS' in x else 0)
sns.barplot(x=df['IPS'],y=df['Price'])
plt.title('IPS by Price')
```

[35]: Text(0.5, 1.0, 'IPS by Price')



**Insight:** From the barchart, it is evident that laptops with IPS Panel have high price range.

```
[36]:
      temp=df['ScreenResolution'].str.split('x',n=1,expand=True)
[37]: df['screen_width']=temp[0]
      df['screen_height']=temp[1]
      df.head()
[37]:
        Company
                   TypeName
                             Inches
                                                         ScreenResolution \
          Apple
                 Ultrabook
                               13.3
                                      IPS Panel Retina Display 2560x1600
                               13.3
      1
          Apple
                 Ultrabook
                                                                  1440x900
      2
             HP
                  Notebook
                               15.6
                                                        Full HD 1920x1080
      3
                               15.4
                                      IPS Panel Retina Display 2880x1800
          Apple
                 {\tt Ultrabook}
      4
          Apple
                 {\tt Ultrabook}
                               13.3
                                      IPS Panel Retina Display 2560x1600
                                 Cpu
                                      Ram
                                                          Memory
      0
                                         8
                                                       128GB SSD
               Intel Core i5 2.3GHz
               Intel Core i5 1.8GHz
                                            128GB Flash Storage
      1
                                         8
      2
         Intel Core i5 7200U 2.5GHz
                                         8
                                                       256GB SSD
      3
               Intel Core i7 2.7GHz
                                        16
                                                       512GB SSD
```

```
Intel Core i5 3.1GHz
      4
                                                      256GB SSD
                                   Gpu
                                        OpSys
                                                Weight
                                                                      Touchscreen
                                                                                    IPS
         Intel Iris Plus Graphics 640
                                         macOS
                                                  1.37
                                                          71378.6832
               Intel HD Graphics 6000
                                         macOS
                                                  1.34
                                                         47895.5232
                                                                                 0
                                                                                      0
      1
                Intel HD Graphics 620
                                                  1.86
                                                                                      0
      2
                                         No OS
                                                         30636.0000
                                                                                 0
                   AMD Radeon Pro 455
                                        macOS
                                                                                 0
                                                                                      1
      3
                                                  1.83 135195.3360
         Intel Iris Plus Graphics 650
                                                                                 0
                                                                                      1
                                        macOS
                                                  1.37
                                                          96095.8080
                           screen_width screen_height
         IPS Panel Retina Display 2560
                                                  1600
      1
                                   1440
                                                   900
      2
                           Full HD 1920
                                                  1080
      3 IPS Panel Retina Display 2880
                                                  1800
      4 IPS Panel Retina Display 2560
                                                  1600
[38]: df['screen_width']=df['screen_width'].str.findall(r'(\d+\.?\d+)').apply(lambda_
       \rightarrow x : x[0])
      df.head()
[38]:
        Company
                  TypeName
                            Inches
                                                        ScreenResolution \
          Apple Ultrabook
                               13.3
                                     IPS Panel Retina Display 2560x1600
      0
                               13.3
      1
          Apple Ultrabook
                                                                 1440x900
             ΗP
      2
                  Notebook
                               15.6
                                                       Full HD 1920x1080
      3
          Apple Ultrabook
                               15.4
                                     IPS Panel Retina Display 2880x1800
          Apple Ultrabook
                               13.3
                                     IPS Panel Retina Display 2560x1600
                                 Cpu Ram
                                                         Memory \
      0
               Intel Core i5 2.3GHz
                                         8
                                                      128GB SSD
               Intel Core i5 1.8GHz
      1
                                            128GB Flash Storage
                                         8
         Intel Core i5 7200U 2.5GHz
                                                      256GB SSD
                                         8
      3
               Intel Core i7 2.7GHz
                                        16
                                                      512GB SSD
               Intel Core i5 3.1GHz
                                                      256GB SSD
                                   Gpu
                                       OpSys
                                                Weight
                                                                      Touchscreen
                                                                                    IPS
                                                               Price
         Intel Iris Plus Graphics 640
                                         macOS
                                                  1.37
                                                                                      1
      0
                                                         71378.6832
                                                                                 0
               Intel HD Graphics 6000
                                                                                      0
      1
                                         macOS
                                                  1.34
                                                         47895.5232
                                                                                 0
      2
                Intel HD Graphics 620
                                         No OS
                                                  1.86
                                                                                 0
                                                                                      0
                                                          30636.0000
                    AMD Radeon Pro 455
                                         macOS
                                                  1.83 135195.3360
                                                                                 0
                                                                                      1
        Intel Iris Plus Graphics 650
                                                  1.37
                                         macOS
                                                         96095.8080
        screen_width screen_height
      0
                2560
                               1600
                1440
                                900
      1
      2
                1920
                               1080
      3
                2880
                               1800
                2560
                               1600
```

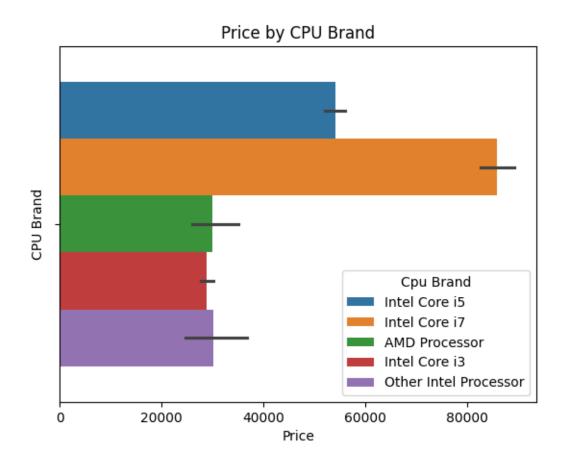
```
[39]: df['screen_width']=df['screen_width'].astype(int)
      df['screen_height']=df['screen_height'].astype(int)
[40]: df['PPI']=(((df['screen_width']**2)+(df['screen_height']**2))**0.5/

→df['Inches']).astype(float)
[41]: df.dtypes
[41]: Company
                           object
      TypeName
                           object
      Inches
                          float64
      ScreenResolution
                           object
      Cpu
                           object
      Ram
                            int64
      Memory
                           object
      Gpu
                           object
                           object
      OpSys
      Weight
                          float64
                          float64
      Price
      Touchscreen
                            int64
      IPS
                            int64
      screen_width
                            int64
      screen_height
                            int64
      PPI
                          float64
      dtype: object
[42]: df.
       odrop(['ScreenResolution','Inches','screen_width','screen_height'],axis=1,inplace=True)
      df.head()
[42]:
        Company
                  TypeName
                                                    Cpu Ram
                                                                            Memory \
          Apple Ultrabook
                                   Intel Core i5 2.3GHz
                                                           8
                                                                         128GB SSD
      0
      1
          Apple Ultrabook
                                   Intel Core i5 1.8GHz
                                                              128GB Flash Storage
             ΗP
                  Notebook Intel Core i5 7200U 2.5GHz
      2
                                                           8
                                                                         256GB SSD
      3
          Apple Ultrabook
                                  Intel Core i7 2.7GHz
                                                          16
                                                                         512GB SSD
          Apple
                 Ultrabook
                                  Intel Core i5 3.1GHz
                                                                         256GB SSD
                                  Gpu
                                       OpSys Weight
                                                             Price
                                                                    Touchscreen IPS
         Intel Iris Plus Graphics 640
                                       macOS
      0
                                                 1.37
                                                        71378.6832
                                                                               0
                                                                                    1
      1
               Intel HD Graphics 6000
                                       macOS
                                                 1.34
                                                        47895.5232
                                                                               0
                                                                                    0
      2
                Intel HD Graphics 620
                                       No OS
                                                 1.86
                                                        30636.0000
                                                                               0
                                                                                    0
      3
                   AMD Radeon Pro 455
                                       macOS
                                                 1.83 135195.3360
                                                                               0
                                                                                    1
      4 Intel Iris Plus Graphics 650
                                                 1.37
                                                        96095.8080
                                                                                    1
                                       macOS
                PPI
      0 226.983005
      1 127.677940
```

```
4 226.983005
[43]: df['Cpu'].value_counts()
[43]: Cpu
      Intel Core i5 7200U 2.5GHz
                                     190
      Intel Core i7 7700HQ 2.8GHz
                                     146
      Intel Core i7 7500U 2.7GHz
                                     132
      Intel Core i7 8550U 1.8GHz
                                      73
      Intel Core i5 8250U 1.6GHz
                                      72
      Intel Core M M3-6Y30 0.9GHz
                                       1
      AMD A9-Series 9420 2.9GHz
                                       1
      Intel Core i5 2.9GHz
                                       1
      AMD A6-Series 7310 2GHz
                                       1
      AMD A9-Series 9410 2.9GHz
      Name: count, Length: 118, dtype: int64
[44]: df['Cpu Name']=df['Cpu'].apply(lambda x:' '.join(x.split()[0:3]))
      df.head()
       Company
                  TypeName
                                                   Cpu Ram
                                                                           Memory \
[44]:
                                  Intel Core i5 2.3GHz
      0
          Apple Ultrabook
                                                          8
                                                                        128GB SSD
          Apple Ultrabook
                                  Intel Core i5 1.8GHz
      1
                                                          8
                                                              128GB Flash Storage
            ΗP
                 Notebook Intel Core i5 7200U 2.5GHz
      2
                                                          8
                                                                        256GB SSD
      3
          Apple Ultrabook
                                  Intel Core i7 2.7GHz
                                                         16
                                                                        512GB SSD
          Apple Ultrabook
                                  Intel Core i5 3.1GHz
                                                                        256GB SSD
                                                          8
                                       OpSys Weight
                                                            Price Touchscreen
                                                                                 TPS
                                  Gpu
         Intel Iris Plus Graphics 640
                                       {\tt macOS}
                                                1.37
                                                       71378.6832
                                                                              0
                                                                                   1
      1
               Intel HD Graphics 6000
                                       macOS
                                                1.34
                                                       47895.5232
                                                                              0
                                                                                   0
      2
                Intel HD Graphics 620
                                      No OS
                                                                                   0
                                                1.86
                                                       30636.0000
                                                                              0
                   AMD Radeon Pro 455
                                                                                   1
      3
                                       macOS
                                                1.83 135195.3360
                                                                              0
       Intel Iris Plus Graphics 650
                                       macOS
                                                1.37
                                                       96095.8080
                PPI
                          Cpu Name
      0 226.983005 Intel Core i5
      1 127.677940 Intel Core i5
      2 141.211998 Intel Core i5
      3 220.534624 Intel Core i7
      4 226.983005 Intel Core i5
[45]: def Cpu_processor(text):
        if text=='Intel Core i7' or text=='Intel Core i5' or text=='Intel Core i3':
          return text
```

2 141.2119983 220.534624

```
else:
          if text.split()[0]=="Intel":
            return 'Other Intel Processor'
            return 'AMD Processor'
[46]: df['Cpu Brand']=df['Cpu Name'].apply(Cpu_processor)
      df.head()
[46]:
        Company
                 TypeName
                                                   Cpu Ram
                                                                          Memory \
          Apple Ultrabook
                                  Intel Core i5 2.3GHz
                                                                       128GB SSD
      1
          Apple Ultrabook
                                  Intel Core i5 1.8GHz
                                                             128GB Flash Storage
      2
            ΗP
                 Notebook Intel Core i5 7200U 2.5GHz
                                                          8
                                                                       256GB SSD
      3
          Apple Ultrabook
                                  Intel Core i7 2.7GHz
                                                         16
                                                                       512GB SSD
                                  Intel Core i5 3.1GHz
                                                          8
                                                                       256GB SSD
          Apple Ultrabook
                                                                                IPS
                                  Gpu
                                       OpSys Weight
                                                                   Touchscreen
                                                            Price
        Intel Iris Plus Graphics 640
                                       macOS
                                                1.37
                                                       71378.6832
               Intel HD Graphics 6000
                                       macOS
                                                1.34
                                                                                  0
      1
                                                       47895.5232
                Intel HD Graphics 620
      2
                                      No OS
                                                1.86
                                                       30636.0000
                                                                             0
                                                                                  0
                   AMD Radeon Pro 455 macOS
                                                1.83 135195.3360
      3
                                                                             0
                                                                                  1
       Intel Iris Plus Graphics 650 macOS
                                                1.37
                                                       96095.8080
                                                                             0
                                                                                  1
                PPI
                          Cpu Name
                                        Cpu Brand
      0 226.983005 Intel Core i5
                                    Intel Core i5
      1 127.677940 Intel Core i5
                                    Intel Core i5
      2 141.211998 Intel Core i5
                                    Intel Core i5
      3 220.534624 Intel Core i7
                                    Intel Core i7
      4 226.983005 Intel Core i5
                                   Intel Core i5
[48]: sns.barplot(data=df,
                  x='Price',
                  hue='Cpu Brand')
      plt.title('Price by CPU Brand')
      plt.xlabel('Price')
      plt.ylabel('CPU Brand')
      plt.show()
```



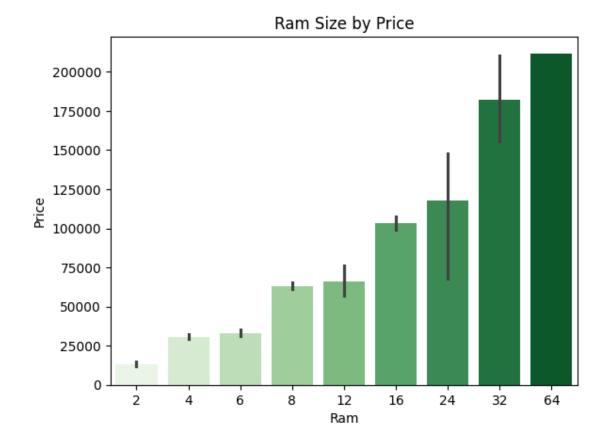
**Insight:** From the barchart, it is evident that most of the laptops have intel core i7 processor.

```
[49]: df.drop(['Cpu', 'Cpu Name'],axis=1,inplace=True)
      df.head()
                  TypeName
[49]:
        Company
                             Ram
                                               Memory
                                                                                  Gpu \
                                            128GB SSD
      0
          Apple
                 Ultrabook
                               8
                                                        Intel Iris Plus Graphics 640
                                                              Intel HD Graphics 6000
      1
          Apple
                 Ultrabook
                               8
                                  128GB Flash Storage
      2
             ΗP
                  Notebook
                                            256GB SSD
                                                               Intel HD Graphics 620
                               8
      3
          Apple
                 Ultrabook
                              16
                                            512GB SSD
                                                                  AMD Radeon Pro 455
                 Ultrabook
          Apple
                                            256GB SSD
                                                        Intel Iris Plus Graphics 650
                               8
                                                                         Cpu Brand
         OpSys
                Weight
                               Price
                                      Touchscreen
                                                   IPS
                                                                PPI
      0 macOS
                  1.37
                          71378.6832
                                                0
                                                         226.983005
                                                                     Intel Core i5
                                                      1
      1 macOS
                  1.34
                          47895.5232
                                                0
                                                         127.677940
                                                                     Intel Core i5
      2 No OS
                  1.86
                          30636.0000
                                                0
                                                      0
                                                         141.211998
                                                                     Intel Core i5
      3 macOS
                        135195.3360
                                                         220.534624
                                                                     Intel Core i7
                  1.83
                                                0
      4 macOS
                  1.37
                          96095.8080
                                                0
                                                         226.983005
                                                                     Intel Core i5
[50]: df['Ram'].value_counts()
```

```
[50]: Ram
      8
             613
      4
             366
      16
             198
      6
              35
      12
              25
      32
              17
      2
              16
      24
               3
      64
                1
      Name: count, dtype: int64
```

```
[52]: sns.barplot(x=df['Ram'],y=df['Price'],palette='Greens')
plt.title('Ram Size by Price')
```

[52]: Text(0.5, 1.0, 'Ram Size by Price')



**Insight:** From the barchart, it is clear that most of the laptops have 64GB Ram.

```
[53]: df['Memory'].value_counts()
```

```
[53]: Memory
      256GB SSD
                                        412
      1TB HDD
                                        215
      500GB HDD
                                        123
      512GB SSD
                                        114
      128GB SSD + 1TB HDD
                                         94
      128GB SSD
                                         74
      256GB SSD + 1TB HDD
                                         73
      32GB Flash Storage
                                         36
      2TB HDD
                                         16
      512GB SSD + 1TB HDD
                                         14
      1TB SSD
                                         14
                                         13
      64GB Flash Storage
      256GB SSD + 2TB HDD
                                         10
      256GB Flash Storage
                                          8
                                          7
      16GB Flash Storage
      1.0TB Hybrid
                                          7
      32GB SSD
                                          6
      180GB SSD
                                          5
                                          4
      128GB Flash Storage
      512GB SSD + 2TB HDD
                                          3
      16GB SSD
                                          3
                                          2
      512GB Flash Storage
      1TB SSD + 1TB HDD
                                          2
      256GB SSD + 500GB HDD
                                          2
      128GB SSD + 2TB HDD
                                          2
                                          2
      256GB SSD + 256GB SSD
      512GB SSD + 256GB SSD
                                          1
      512GB SSD + 512GB SSD
                                          1
      64GB Flash Storage + 1TB HDD
      1TB HDD + 1TB HDD
                                          1
      32GB HDD
                                          1
      64GB SSD
                                          1
      128GB HDD
                                          1
      240GB SSD
                                          1
      8GB SSD
                                          1
      508GB Hybrid
                                          1
      1.0TB HDD
      512GB SSD + 1.0TB Hybrid
                                          1
      256GB SSD + 1.0TB Hybrid
                                          1
      Name: count, dtype: int64
[54]: | df['Memory'] = df['Memory'].astype(str).replace('\.0', '', regex=True)
      df["Memory"] = df["Memory"].str.replace('GB', '')
      df["Memory"] = df["Memory"].str.replace('TB', '000')
      new = df["Memory"].str.split("+", n = 1, expand = True)
```

```
df["second"] = new[1]
      df.head()
[54]:
        Company
                  TypeName
                             Ram
                                              Memory
                                                                                 Gpu \
          Apple
                 Ultrabook
                               8
                                             128 SSD
                                                      Intel Iris Plus Graphics 640
                               8
                                                             Intel HD Graphics 6000
          Apple
                 Ultrabook
                                  128 Flash Storage
      1
      2
             ΗP
                  Notebook
                               8
                                             256 SSD
                                                              Intel HD Graphics 620
                                                                 AMD Radeon Pro 455
      3
          Apple Ultrabook
                              16
                                             512 SSD
          Apple
                 Ultrabook
                               8
                                             256 SSD
                                                      Intel Iris Plus Graphics 650
         OpSys
                Weight
                               Price
                                      Touchscreen
                                                    IPS
                                                                 PPI
                                                                          Cpu Brand \
                                                                      Intel Core i5
      0
        macOS
                   1.37
                          71378.6832
                                                      1
                                                          226.983005
        macOS
                   1.34
                          47895.5232
                                                 0
                                                      0
                                                         127.677940
                                                                      Intel Core i5
      1
      2
        No OS
                   1.86
                          30636.0000
                                                 0
                                                         141.211998
                                                                      Intel Core i5
                   1.83
                         135195.3360
                                                 0
                                                         220.534624
                                                                      Intel Core i7
      3 macOS
                                                      1
      4 macOS
                          96095.8080
                                                                     Intel Core i5
                   1.37
                                                 0
                                                      1
                                                         226.983005
                      first second
      0
                    128 SSD
                              None
         128 Flash Storage
                              None
      1
      2
                    256 SSD
                              None
      3
                   512 SSD
                              None
      4
                   256 SSD
                              None
[55]: df['first'].value_counts()
[55]: first
      256 SSD
                            412
      1000 HDD
                            216
      500 HDD
                            123
      512 SSD
                            114
      128 SSD
                             96
      256 SSD
                             88
      128 SSD
                             74
      32 Flash Storage
                             36
      512 SSD
                             20
      2000 HDD
                             16
      1000 SSD
                             14
                             13
      64 Flash Storage
      256 Flash Storage
                              8
      16 Flash Storage
                              7
      1000 Hybrid
                              7
      32 SSD
                              6
                              5
      180 SSD
      128 Flash Storage
                              4
      16 SSD
                              3
```

df["first"] = new[0]

```
1000 SSD
                             2
      512 Flash Storage
      64 SSD
                              1
      64 Flash Storage
      1000 HDD
                              1
      32 HDD
                              1
      128 HDD
                              1
                              1
      240 SSD
      8 SSD
                              1
      508 Hybrid
                              1
      Name: count, dtype: int64
[56]: df['second'].value_counts()
[56]: second
        1000 HDD
                       185
        2000 HDD
                        15
        256 SSD
                         3
                         2
        500 HDD
        1000 Hybrid
                         2
        512 SSD
      Name: count, dtype: int64
[57]: df["Layer1HDD"] = df["first"].apply(lambda x: 1 if "HDD" in x else 0)
      df["Layer1SSD"] = df["first"].apply(lambda x: 1 if "SSD" in x else 0)
      df["Layer1Hybrid"] = df["first"].apply(lambda x: 1 if "Hybrid" in x else 0)
      df["Layer1Flash_Storage"] = df["first"].apply(lambda x: 1 if "Flash Storage" in_
       \rightarrowx else 0)
      df.head()
[57]:
                                                                               Gpu \
        Company
                  TypeName
                            Ram
                                             Memory
                                            128 SSD
                                                     Intel Iris Plus Graphics 640
          Apple Ultrabook
                              8
          Apple
                Ultrabook
                                 128 Flash Storage
                                                           Intel HD Graphics 6000
      1
             ΗP
                                                            Intel HD Graphics 620
      2
                  Notebook
                              8
                                            256 SSD
          Apple Ultrabook
                                                               AMD Radeon Pro 455
      3
                             16
                                            512 SSD
          Apple
                Ultrabook
                                            256 SSD
                                                     Intel Iris Plus Graphics 650
         OpSys Weight
                              Price
                                     Touchscreen
                                                   IPS
                                                               PPI
                                                                         Cpu Brand \
      0 macOS
                                                                     Intel Core i5
                  1.37
                         71378.6832
                                                0
                                                     1
                                                        226.983005
      1 macOS
                  1.34
                         47895.5232
                                                0
                                                        127.677940
                                                                     Intel Core i5
      2 No OS
                  1.86
                                                        141.211998
                                                                     Intel Core i5
                         30636.0000
                                                0
      3 macOS
                  1.83
                        135195.3360
                                                0
                                                     1
                                                        220.534624
                                                                     Intel Core i7
      4 macOS
                  1.37
                         96095.8080
                                                        226.983005 Intel Core i5
                                                     1
                     first second Layer1HDD Layer1SSD Layer1Hybrid \
                   128 SSD
                             None
                                            0
                                                       1
                                            0
                                                       0
        128 Flash Storage
                                                                      0
                             None
```

```
2
                   256 SSD
                              None
                                             0
                                                                       0
                                                        1
      3
                   512 SSD
                                                                       0
                              None
                                             0
                                                        1
      4
                                                                       0
                   256 SSD
                              None
                                             0
                                                        1
         Layer1Flash_Storage
      0
      1
                            1
      2
                            0
                            0
      3
      4
                            0
[58]: df['first'] = df['first'].str.findall(r'\d+').apply(lambda x:x[0])
      df["second"].fillna("0", inplace = True)
      df.head()
                  TypeName
                                                                                Gpu \
[58]:
        Company
                             Ram
                                              Memory
                 Ultrabook
                                             128 SSD
                                                      Intel Iris Plus Graphics 640
          Apple
                               8
      1
          Apple
                 Ultrabook
                               8
                                  128 Flash Storage
                                                             Intel HD Graphics 6000
                                                              Intel HD Graphics 620
      2
             ΗP
                  Notebook
                               8
                                             256 SSD
          Apple
                 Ultrabook
                                             512 SSD
                                                                 AMD Radeon Pro 455
                              16
          Apple
                 Ultrabook
                               8
                                             256 SSD
                                                      Intel Iris Plus Graphics 650
         OpSys
                Weight
                               Price
                                      Touchscreen
                                                    IPS
                                                                 PPI
                                                                          Cpu Brand
         macOS
                  1.37
                          71378.6832
                                                         226.983005
                                                                      Intel Core i5
                                                      1
                  1.34
                                                                      Intel Core i5
      1
        macOS
                          47895.5232
                                                 0
                                                         127.677940
      2 No OS
                  1.86
                                                 0
                                                         141.211998
                                                                      Intel Core i5
                          30636.0000
      3 macOS
                  1.83
                         135195.3360
                                                 0
                                                         220.534624
                                                                      Intel Core i7
         macOS
                  1.37
                          96095.8080
                                                 0
                                                         226.983005
                                                                      Intel Core i5
                                             Layer1Hybrid Layer1Flash_Storage
        first second
                      Layer1HDD
                                  Layer1SSD
      0
          128
                   0
                               0
                                           1
                                                         0
                                                                               0
          128
                   0
                               0
                                           0
                                                         0
                                                                               1
      1
      2
          256
                   0
                               0
                                           1
                                                         0
                                                                               0
          512
                                                         0
                                                                               0
      3
                   0
                               0
                                           1
          256
                   0
                               0
                                           1
                                                         0
                                                                               0
[59]: df["Layer2HDD"] = df["second"].apply(lambda x: 1 if "HDD" in x else 0)
      df["Layer2SSD"] = df["second"].apply(lambda x: 1 if "SSD" in x else 0)
      df["Layer2Hybrid"] = df["second"].apply(lambda x: 1 if "Hybrid" in x else 0)
      df["Layer2Flash_Storage"] = df["second"].apply(lambda x: 1 if "Flash Storage"__
       \rightarrowin x else 0)
      df.head()
[59]:
                  TypeName
                                                                                Gpu \
        Company
                             Ram
                                              Memory
                 Ultrabook
                               8
                                             128 SSD
                                                      Intel Iris Plus Graphics 640
          Apple
          Apple
                 Ultrabook
                               8
                                  128 Flash Storage
                                                             Intel HD Graphics 6000
      1
      2
             ΗP
                  Notebook
                                             256 SSD
                                                              Intel HD Graphics 620
                               8
```

```
256 SSD
          Apple
                 Ultrabook
                                8
                                                       Intel Iris Plus Graphics 650
         OpSys
                Weight
                                Price
                                       Touchscreen
                                                     IPS
                                                              first second Layer1HDD
         macOS
                   1.37
                          71378.6832
                                                  0
                                                       1
                                                                128
                                                                          0
                                                                                    0
      0
         macOS
                   1.34
                          47895.5232
                                                  0
                                                       0
                                                                128
                                                                          0
                                                                                    0
      2
         No OS
                   1.86
                          30636.0000
                                                  0
                                                       0
                                                                256
                                                                          0
                                                                                    0
         macOS
                                                  0
                                                       1
                                                                          0
                                                                                    0
      3
                   1.83
                         135195.3360
                                                                512
                                                                                    0
      4 macOS
                   1.37
                          96095.8080
                                                  0
                                                       1
                                                                256
                                                                          0
                   Layer1Hybrid Layer1Flash_Storage
                                                        Layer2HDD
                                                                     Layer2SSD
        Layer1SSD
      0
                 1
                                0
                                                      1
      1
                 0
                                                                  0
                                                                              0
      2
                                0
                                                      0
                                                                  0
                                                                              0
                 1
      3
                 1
                                0
                                                      0
                                                                  0
                                                                              0
      4
                                                      0
                                                                  0
                                                                              0
                 1
                                0
         Layer2Hybrid
                        Layer2Flash_Storage
      0
                     0
                     0
                                            0
      1
      2
                     0
                                            0
      3
                     0
                                            0
      4
                     0
                                            0
      [5 rows x 22 columns]
[60]: df['second'] = df['second'].str.findall(r'\d+').apply(lambda x:x[0])
      df.head()
[60]:
        Company
                   TypeName
                                                                                  Gpu \
                             Ram
                                               Memory
          Apple
                 Ultrabook
                                8
                                              128 SSD
                                                       Intel Iris Plus Graphics 640
      0
                                                              Intel HD Graphics 6000
      1
          Apple
                 Ultrabook
                                8
                                   128 Flash Storage
      2
             ΗP
                   Notebook
                                              256 SSD
                                                               Intel HD Graphics 620
                               8
                                                                  AMD Radeon Pro 455
          Apple Ultrabook
                               16
                                              512 SSD
          Apple
                 Ultrabook
                                              256 SSD Intel Iris Plus Graphics 650
         OpSys
                 Weight
                               Price
                                       Touchscreen
                                                     IPS
                                                              first second Layer1HDD
      0
         macOS
                   1.37
                          71378.6832
                                                  0
                                                       1
                                                                128
                                                                          0
                                                                                    0
         macOS
                   1.34
                          47895.5232
                                                  0
                                                       0
                                                                128
                                                                          0
                                                                                    0
      1
      2
        No OS
                   1.86
                          30636.0000
                                                  0
                                                       0
                                                                256
                                                                          0
                                                                                    0
      3 macOS
                   1.83
                         135195.3360
                                                  0
                                                       1
                                                                512
                                                                          0
                                                                                    0
                   1.37
         macOS
                          96095.8080
                                                                256
                                                                          0
                                                                                    0
        Layer1SSD Layer1Hybrid Layer1Flash_Storage Layer2HDD
                                                                     Layer2SSD
      0
                                                      0
                                                                  0
                                                                              0
                 1
                                0
                 0
                                0
                                                                  0
                                                                              0
      1
                                                      1
      2
                 1
                                0
                                                      0
                                                                  0
                                                                              0
```

512 SSD

3

Apple Ultrabook

16

AMD Radeon Pro 455

```
3
                1
                               0
                                                     0
                                                                0
                                                                            0
      4
                1
                               0
                                                                            0
         Layer2Hybrid Layer2Flash_Storage
      0
                    0
                                          0
      1
      2
                    0
                                          0
      3
                    0
                                          0
      4
                    0
                                          0
      [5 rows x 22 columns]
[61]: df['first'].value_counts()
[61]: first
      256
              508
      1000
              240
      128
              175
      512
              136
      500
              123
      32
               43
      2000
               16
      64
               15
      16
               10
      180
                5
      240
                1
                1
      508
                1
      Name: count, dtype: int64
[62]: df['second'].value_counts()
[62]: second
              1066
      1000
               187
      2000
                15
      256
                 3
      500
                 2
      512
                 1
      Name: count, dtype: int64
[63]: df["first"] = df["first"].astype(int)
      df["second"] = df["second"].astype(int)
[64]: df["HDD"]=(df["first"]*df["Layer1HDD"]+df["second"]*df["Layer2HDD"])
      df["SSD"]=(df["first"]*df["Layer1SSD"]+df["second"]*df["Layer2SSD"])
      df["Hybrid"]=(df["first"]*df["Layer1Hybrid"]+df["second"]*df["Layer2Hybrid"])
```

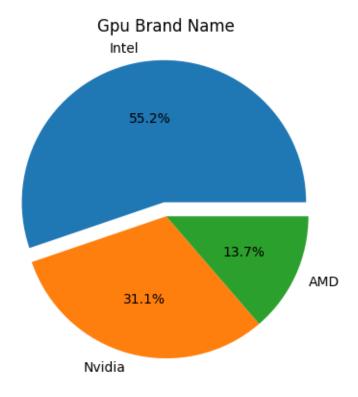
```
df["Flash_Storage"]=(df["first"]*df["Layer1Flash_Storage"]+df["second"]*df["Layer2Flash_Storage"]
     df.drop(columns=['Memory','first', 'second', 'Layer1HDD', 'Layer1SSD', |
       'Layer1Flash_Storage', 'Layer2HDD', 'Layer2SSD', 'Layer2Hybrid',
             'Layer2Flash Storage'],inplace=True)
     df.head()
[64]:
       Company
                 TypeName Ram
                                                         Gpu OpSys
                                                                    Weight \
         Apple Ultrabook
                                Intel Iris Plus Graphics 640 macOS
                                                                       1.37
     1
         Apple Ultrabook
                             8
                                      Intel HD Graphics 6000
                                                              macOS
                                                                       1.34
                                       Intel HD Graphics 620 No OS
     2
            ΗP
                Notebook
                             8
                                                                       1.86
     3 Apple Ultrabook
                            16
                                          AMD Radeon Pro 455 macOS
                                                                       1.83
                               Intel Iris Plus Graphics 650 macOS
     4
         Apple Ultrabook
                                                                       1.37
                     Touchscreen
                                 IPS
                                              PPI
                                                       Cpu Brand HDD SSD Hybrid \
                                       226.983005 Intel Core i5
     0
         71378.6832
                                                                       128
                                                                                 0
                                    0 127.677940 Intel Core i5
     1
         47895.5232
                               0
                                                                    0
                                                                         0
                                                                                 0
         30636.0000
                               0
                                    0 141.211998 Intel Core i5
                                                                    0 256
                                                                                 0
     2
                                    1 220.534624 Intel Core i7
     3 135195.3360
                               0
                                                                    0 512
                                                                                 0
         96095.8080
                               0
                                    1 226.983005 Intel Core i5
                                                                       256
                                                                                 0
        Flash_Storage
     0
                  128
     1
     2
                    0
     3
                    0
     4
                    0
[65]: df.corr(numeric_only=True)['Price']
[65]: Ram
                      0.740106
     Weight
                      0.212192
     Price
                      1.000000
     Touchscreen
                      0.188631
     IPS
                      0.250358
     PPI
                      0.469539
     HDD
                     -0.098011
     SSD
                      0.669957
     Hybrid
                      0.022533
     Flash_Storage
                     -0.037176
     Name: Price, dtype: float64
[66]: df.drop(['Hybrid', 'Flash_Storage'],axis=1,inplace=True)
     df.head()
```

```
TypeName
        Company
                                                           Gpu OpSys
                                                                       Weight \
                                 Intel Iris Plus Graphics 640
      0
          Apple Ultrabook
                              8
                                                                macOS
                                                                          1.37
          Apple Ultrabook
                              8
                                        Intel HD Graphics 6000
                                                                macOS
                                                                          1.34
      1
      2
             ΗP
                  Notebook
                                         Intel HD Graphics 620
                                                                No OS
                                                                          1.86
                              8
                                            AMD Radeon Pro 455
                                                                          1.83
      3
          Apple Ultrabook
                             16
                                                                macOS
          Apple Ultrabook
                                 Intel Iris Plus Graphics 650
                                                                          1.37
                              8
                                                                macOS
               Price
                      Touchscreen
                                   IPS
                                                PPI
                                                         Cpu Brand
                                                                    HDD
                                                                          SSD
          71378.6832
                                                     Intel Core i5
                                                                          128
      0
                                0
                                        226.983005
                                                                      0
                                      1
      1
          47895.5232
                                0
                                        127.677940
                                                     Intel Core i5
                                                                            0
      2
                                0
                                                     Intel Core i5
                                                                          256
          30636.0000
                                      0 141.211998
      3
       135195.3360
                                0
                                        220.534624
                                                     Intel Core i7
                                                                          512
                                0
                                      1 226.983005 Intel Core i5
                                                                          256
          96095.8080
[67]: df['Gpu'].value_counts()
[67]: Gpu
      Intel HD Graphics 620
                                  279
      Intel HD Graphics 520
                                  181
      Intel UHD Graphics 620
                                  68
      Nvidia GeForce GTX 1050
                                   66
      Nvidia GeForce GTX 1060
                                   48
      AMD Radeon R5 520
                                   1
      AMD Radeon R7
                                   1
      Intel HD Graphics 540
                                   1
      AMD Radeon 540
                                   1
      ARM Mali T860 MP4
      Name: count, Length: 110, dtype: int64
[68]: df['Gpu Brand Name']=df['Gpu'].apply(lambda x:x.split()[0])
      df=df[df['Gpu Brand Name']!='ARM']
      df.drop('Gpu',axis=1,inplace=True)
      df.head()
                                 OpSys
                                                                            IPS
[68]:
        Company
                  TypeName
                            Ram
                                        Weight
                                                       Price
                                                              Touchscreen
          Apple Ultrabook
                              8
                                 macOS
                                           1.37
                                                  71378.6832
                                                                         0
                                                                              1
      0
                                 macOS
                                           1.34
                                                                         0
                                                                              0
      1
          Apple Ultrabook
                              8
                                                  47895.5232
      2
             ΗP
                  Notebook
                              8
                                 No OS
                                           1.86
                                                                         0
                                                                              0
                                                  30636.0000
      3
          Apple Ultrabook
                             16
                                 macOS
                                           1.83
                                                135195.3360
                                                                         0
                                                                              1
          Apple
                Ultrabook
                              8
                                 macOS
                                           1.37
                                                  96095.8080
                                                                         0
                                                                              1
                PPI
                         Cpu Brand HDD
                                          SSD Gpu Brand Name
      0 226.983005
                                          128
                                                       Intel
                     Intel Core i5
                                       0
      1 127.677940
                     Intel Core i5
                                       0
                                            0
                                                       Intel
                     Intel Core i5
                                          256
      2 141.211998
                                                       Intel
      3 220.534624 Intel Core i7
                                          512
                                                         AMD
```

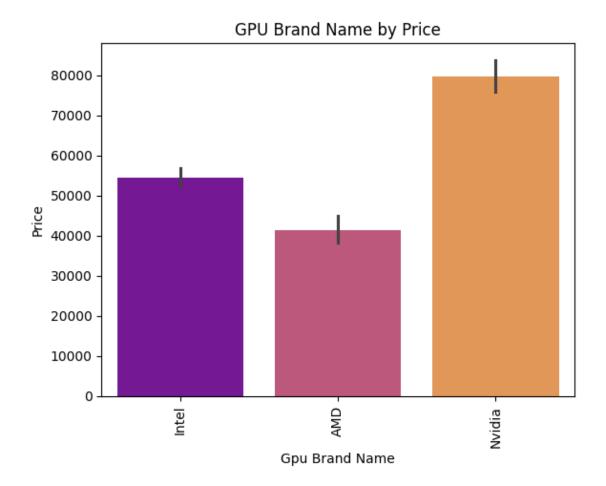
Ram

[66]:

4 226.983005 Intel Core i5 0 256 Intel



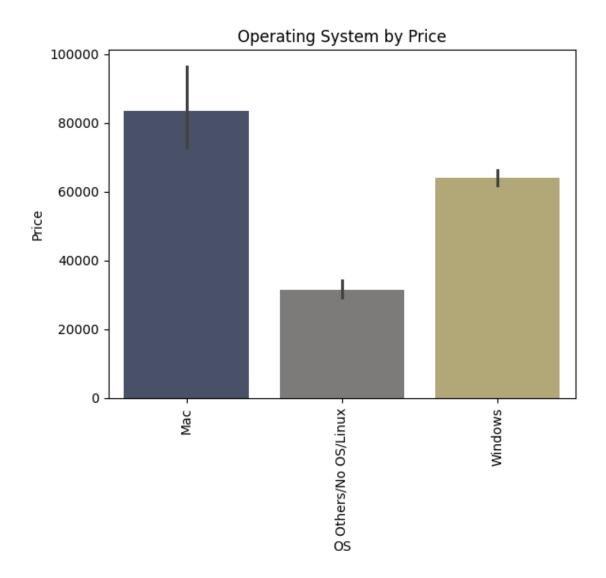
```
[75]: sns.barplot(x=df['Gpu Brand Name'],y=df['Price'],palette='plasma')
  plt.xticks(rotation='vertical')
  plt.title('GPU Brand Name by Price')
  plt.show()
```



**Insight:** From the barchart, it is clear that price range is high for laptops having Nvidia Gpu Processor.

```
[76]: df['OpSys'].value_counts()
[76]: OpSys
      Windows 10
                      1047
      No OS
                        66
      Linux
                        58
      Windows 7
                        45
      Chrome OS
                        26
      macOS
                        13
      Mac OS X
                         8
      Windows 10 S
                         8
      Android
      Name: count, dtype: int64
[77]: def cat_os(inp):
          if inp=='Windows 10' or inp=='Windows 7' or inp=='Windows 10 S':
```

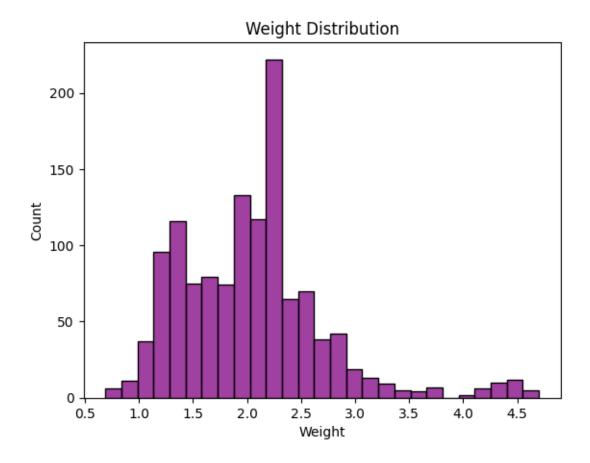
```
return 'Windows'
         elif inp=='macOS' or inp=='Mac OS X':
             return 'Mac'
         else:
             return 'Others/No OS/Linux'
[78]: df['OS'] = df['OpSys'].apply(cat_os)
     df.drop('OpSys',axis=1,inplace=True)
     df.head()
[78]:
       Company
                 TypeName Ram Weight
                                             Price Touchscreen IPS
                                                                            PPI
         Apple Ultrabook
                                 1.37
                                        71378.6832
                                                                  1 226.983005
     1
         Apple Ultrabook
                           8
                                 1.34
                                        47895.5232
                                                              0
                                                                  0 127.677940
                                 1.86
     2
            ΗP
                Notebook 8
                                        30636.0000
                                                              0
                                                                  0 141.211998
     3
         Apple Ultrabook 16
                                 1.83 135195.3360
                                                              0
                                                                  1 220.534624
                                  1.37
                                        96095.8080
                                                                  1 226.983005
         Apple Ultrabook
                           8
                                                              0
            Cpu Brand HDD SSD Gpu Brand Name
                                                               OS
     0 Intel Core i5
                         0 128
                                        Intel
                                                              Mac
     1 Intel Core i5
                                        Intel
                                                              Mac
     2 Intel Core i5
                         0 256
                                        Intel Others/No OS/Linux
     3 Intel Core i7
                         0 512
                                          AMD
                                                              Mac
     4 Intel Core i5
                            256
                                        Intel
                                                              Mac
[80]: sns.barplot(x=df['OS'],y=df['Price'],palette='cividis')
     plt.xticks(rotation='vertical')
     plt.title('Operating System by Price')
     plt.show()
```



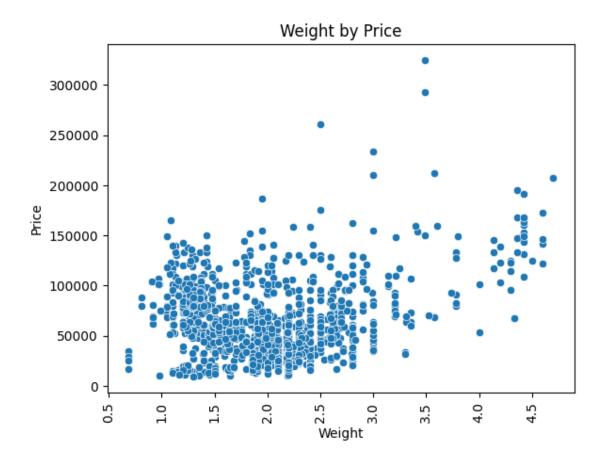
**Insight:** From the barchart, it is evident that price range is high for laptops having Mac OS.

```
[81]: sns.histplot(df['Weight'],color='purple')
plt.title('Weight Distribution')
```

[81]: Text(0.5, 1.0, 'Weight Distribution')

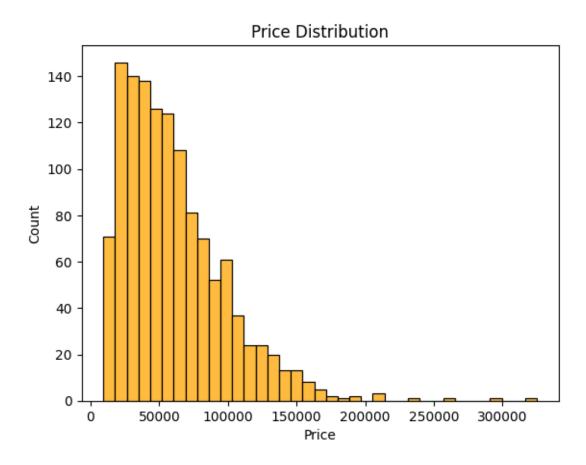


```
[82]: sns.scatterplot(x=df['Weight'],y=df['Price'])
    plt.xticks(rotation='vertical')
    plt.title('Weight by Price')
    plt.show()
```



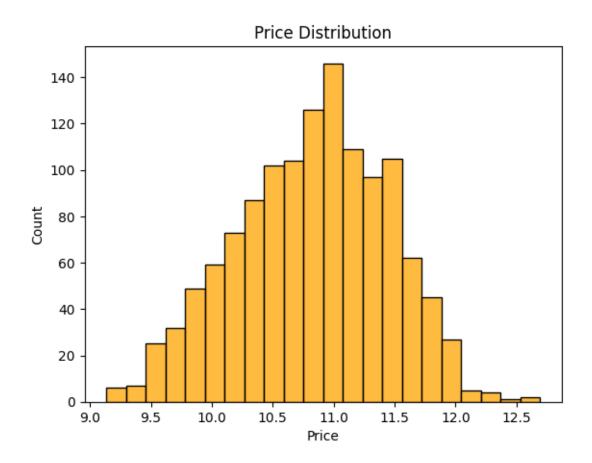
```
[88]: sns.histplot(df['Price'],color='orange')
plt.title('Price Distribution')
```

[88]: Text(0.5, 1.0, 'Price Distribution')



```
[89]: sns.histplot(np.log(df['Price']),color='orange')
plt.title('Price Distribution')
```

[89]: Text(0.5, 1.0, 'Price Distribution')



# 7) Feature Correlation

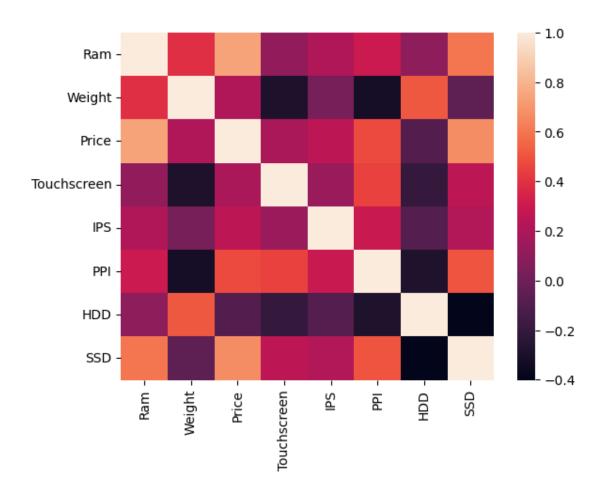
# []: df.corr(numeric\_only=True)

[]:		Ram	Weight	Price	Touchscreen	IPS	PPI	\
	Ram	1.000000	0.389134	0.739996	0.113316	0.202809	0.294927	
	Weight	0.389134	1.000000	0.211667	-0.292288	0.023966	-0.319499	
	Price	0.739996	0.211667	1.000000	0.190382	0.251514	0.471481	
	Touchscreen	0.113316	-0.292288	0.190382	1.000000	0.136973	0.452107	
	IPS	0.202809	0.023966	0.251514	0.136973	1.000000	0.288833	
	PPI	0.294927	-0.319499	0.471481	0.452107	0.288833	1.000000	
	HDD	0.097340	0.510876	-0.098481	-0.205105	-0.090411	-0.290774	
	SSD	0.599552	-0.056985	0.669808	0.252142	0.215197	0.499899	
		HDD	SSD					
	Ram	0.097340	0.599552					
	Weight	0.510876	-0.056985					
	Price	-0.098481	0.669808					
	Touchscreen	-0.205105	0.252142					
	IPS	-0.090411	0.215197					

```
PPI -0.290774 0.499899
HDD 1.000000 -0.400625
SSD -0.400625 1.000000
```

# []: sns.heatmap(df.corr(numeric\_only=True))

#### []: <Axes: >



# 8) Splitting data to X and y

```
[]: Ind_var=df.drop(columns=['Price'])
Ind_var
```

[]:	Company	TypeName	Ram	Weight	Touchscreen	IPS	PPI	\
0	Apple	Ultrabook	8	1.37	0	1	226.983005	
1	Apple	Ultrabook	8	1.34	0	0	127.677940	
2	HP	Notebook	8	1.86	0	0	141.211998	
3	Apple	Ultrabook	16	1.83	0	1	220.534624	
4	Apple	Ultrabook	8	1.37	0	1	226.983005	

```
1269
                          Notebook
                                             2.20
                                                                       100.454670
        Asus
                                       4
1270
      Lenovo
               2 in 1 Convertible
                                       4
                                             1.80
                                                               1
                                                                       157.350512
                                                                       276.053530
1271
      Lenovo
               2 in 1 Convertible
                                      16
                                             1.30
                                                               1
1272
      Lenovo
                          Notebook
                                       2
                                             1.50
                                                               0
                                                                       111.935204
1273
          HP
                          Notebook
                                       6
                                             2.19
                                                                       100.454670
                   Cpu Brand
                                 \mathtt{HDD}
                                      SSD Gpu Brand Name
                                                                              OS
               Intel Core i5
0
                                      128
                                                     Intel
                                   0
                                                                             Mac
1
               Intel Core i5
                                        0
                                                     Intel
                                                                             Mac
               Intel Core i5
2
                                      256
                                                     Intel
                                                            Others/No OS/Linux
3
               Intel Core i7
                                      512
                                                       AMD
                                                                             Mac
4
               Intel Core i5
                                      256
                                                     Intel
                                                                             Mac
                                 500
1269
               Intel Core i7
                                         0
                                                    Nvidia
                                                                         Windows
1270
               Intel Core i7
                                   0
                                      128
                                                     Intel
                                                                         Windows
               Intel Core i7
                                      512
1271
                                                     Intel
                                                                         Windows
1272
      Other Intel Processor
                                                     Intel
                                         0
                                                                         Windows
1273
               Intel Core i7
                                1000
                                                       AMD
                                                                         Windows
```

[1273 rows x 12 columns]

```
[]: Dep_var=np.log(df['Price'])
Dep_var
```

```
[]: 0
             11.175755
              10.776777
     2
             10.329931
     3
             11.814476
             11.473101
     1269
             10.555257
     1270
             10.433899
     1271
              11.288115
     1272
              9.409283
     1273
             10.614129
     Name: Price, Length: 1273, dtype: float64
```

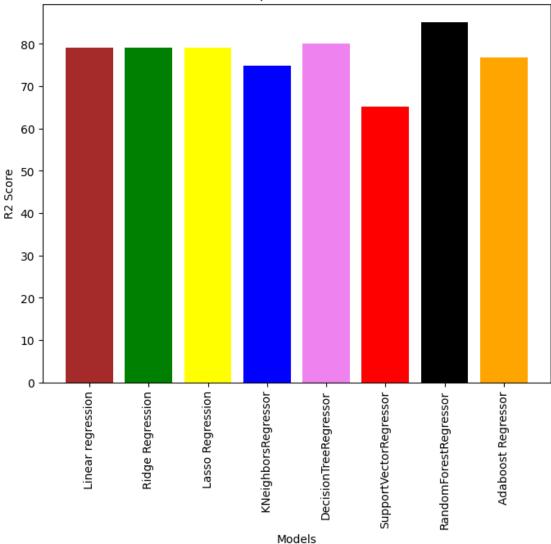
#### 9) Splitting data to train data and test data

# 4 Building ML models

```
[]: step1 =__
    ColumnTransformer(transformers=[('col_tnf',OneHotEncoder(sparse=False,drop='first'),[0,1,7,
    lr=LinearRegression()
    rg=Ridge(alpha=10,random_state=42)
    ls=Lasso(alpha=0.001,random_state=42)
    knn=KNeighborsRegressor(n_neighbors=3)
    dt=DecisionTreeRegressor(max_depth=8,random_state=42)
    sv=SVR(kernel='rbf')
    rf=RandomForestRegressor(n_estimators=100, random_state=42, max_samples=0.
     \rightarrow5,max_features=0.75,max_depth=15)
    ad=AdaBoostRegressor(n_estimators=15,random_state=42)
    step2 = [lr,rg,ls,knn,dt,sv,rf,ad]
    for i in step2:
     print('_'*50,i,'_'*50)
     pipe = Pipeline([('step1',step1),('step2',i)])
     pipe.fit(X_train,y_train)
     y_pred = pipe.predict(X_test)
     print('R2 Score',r2_score(y_test,y_pred))
     print('MAE',mean_absolute_error(y_test,y_pred))
     ______LinearRegression()
   R2 Score 0.7926901156667799
   MAE 0.22065476517716653
   _____ Ridge(alpha=10,
   random_state=42) ______
   R2 Score 0.7927938535467675
   MAE 0.2235451409312221
       ______ Lasso(alpha=0.001,
   random_state=42) ______
   R2 Score 0.7911292878893352
   MAE 0.22399649007048428
   KNeighborsRegressor(n_neighbors=3)
   R2 Score 0.7486634726488367
   MAE 0.2154187555553761
   DecisionTreeRegressor(max_depth=8, random_state=42)
   R2 Score 0.8019037046093079
   MAE 0.2164088620174775
     _____ SVR()
```

```
R2 Score 0.6515291902558747
          MAE 0.26461314868916874
          RandomForestRegressor(max_depth=15, max_features=0.75, max_samples=0.5,
                                                             random state=42)
          R2 Score 0.8525464607117873
          MAE 0.1794891533537441
          AdaBoostRegressor(n_estimators=15, random_state=42)
          R2 Score 0.7688691453495048
          MAE 0.2500654165508208
[]: # Accuracy Comparison
           Table=pd.DataFrame({'Model':['Linear regression','Ridge Regression','Lasso⊔
              →Regression','⊔
              →KNeighborsRegressor', 'DecisionTreeRegressor', 'SupportVectorRegressor', 'RandomForestRegresso
              Green | Regressor | Regre
                                                             'MAE': [0.220,0.223,0.223,0.215,0.216,0.264,0.179,0.250]})
           Table['R2 Score']=Table['R2 Score']*100
           Table
[]:
                                                          Model R2 Score
                                                                                                     MAE
                             Linear regression
                                                                                   79.2 0.220
           0
           1
                                Ridge Regression
                                                                                 79.2 0.223
           2
                                Lasso Regression
                                                                                79.1 0.223
           3
                         KNeighborsRegressor
                                                                                 74.8 0.215
           4
                 DecisionTreeRegressor
                                                                                 80.1 0.216
                                                                               65.1 0.264
           5 SupportVectorRegressor
                    RandomForestRegressor
                                                                                  85.2 0.179
                           Adaboost Regressor
                                                                                   76.8 0.250
[]: # Plotting Accuracy of Models
           plt.figure(figsize=(8,6))
           Models=['Linear regression','Ridge Regression','Lasso Regression','L
              →KNeighborsRegressor', 'DecisionTreeRegressor', 'SupportVectorRegressor', 'RandomForestRegresso
             ⊸Regressor']
           r2_score=[79.2,79.2,79.1,74.8,80.1,65.1,85.2,76.8]
           plt.title('R2 Score comparison between models')
           plt.xlabel('Models')
           plt.ylabel('R2 Score')
              abar(Models,r2_score,color=['brown','green','yellow','blue','violet','red','black','orange']
           plt.xticks(rotation='vertical')
           plt.show()
```





**Insight:** From the bar chart, it is evident that Random Forest Regressor model has high R2 Score and low MAE.

#### Predicting the Laptop Price

```
[]: Pipeline(steps=[('step1',
                      ColumnTransformer(remainder='passthrough',
                                        transformers=[('col_tnf',
                                                       OneHotEncoder(drop='first',
                                                                     sparse=False),
                                                       [0, 1, 7, 10, 11])])),
                     ('step2',
                     RandomForestRegressor(max_depth=15, max_features=0.75,
                                           max_samples=0.5, random_state=3))])
[]: sample = pd.DataFrame([['Apple', 'Ultrabook', '8', '1.37', '0', '1', '226.
      ⇔983005', 'Intel Core i5', '0', '128', 'Intel', 'Mac']],
                           columns=['Company', 'TypeName', 'Ram', 'Weight', _
      →'Touchscreen', 'IPS', 'PPI', 'Cpu Brand', 'HDD', 'SSD', 'Gpu Brand Name', □
      y_new = rf_pipe.predict(sample)
     print('Predicted Price:', y_new)
    Predicted Price: [11.13052688]
[]: Price=np.exp(y_new)
     print("The predicted price of this configuration is ",Price)
    The predicted price of this configuration is [68222.3074989]
    Exporting the model
[]: pickle.dump(rf_pipe,open('rf_pipe.pkl','wb'))
     pickle.dump(df,open('df.pkl','wb'))
    Deploying the model using Stremlit
[]: pip install streamlit -q
                               8.6/8.6 MB
    19.7 MB/s eta 0:00:00
                               207.3/207.3
    kB 17.6 MB/s eta 0:00:00
                               6.9/6.9 MB
    43.2 MB/s eta 0:00:00
                               83.0/83.0 kB
    8.1 MB/s eta 0:00:00
                               62.7/62.7 kB
    6.7 MB/s eta 0:00:00
[]: %%writefile app.py
     import streamlit as st
```

```
from PIL import Image
import pickle
import numpy as np
# Custom CSS to set background color and font color
page_bg_img = '''
<style>
body {
    background-color: #000000;
    color: #ffffff;
/* Style for select boxes */
div[data-baseweb="select"] > div:first-child, .st-ct {
    background-color: #000000 !important;
    color: #ffffff !important;
}
/* Style for number input */
.stNumberInput input {
    background-color: #000000;
    color: #ffffff;
</style>
st.markdown(page_bg_img, unsafe_allow_html=True)
# import the model
pipe = pickle.load(open('/content/drive/MyDrive/saved models/rf_pipe.pkl','rb'))
df = pickle.load(open('/content/drive/MyDrive/saved models/df.pkl','rb'))
st.title("Laptop Price Predictor")
st.subheader("Welcome! Here you can find out the price of your desired Laptop.")
image=Image.open('/content/drive/MyDrive/laptop_img.jpeg')
st.image(image, width=800)
st.subheader("Fill in the fields")
# brand
company = st.selectbox('Brand',df['Company'].unique())
# type of laptop
typename = st.selectbox('Type',df['TypeName'].unique())
# R.a.m
ram = st.selectbox('RAM(in GB)',[2,4,6,8,12,16,24,32,64])
# weight
```

```
weight = st.number_input('Weight of the Laptop')
# Touchscreen
touchscreen = st.selectbox('Touchscreen',['No','Yes'])
# IPS
ips = st.selectbox('IPS',['No','Yes'])
# screen size
inches = st.number_input('Screen Size')
# resolution
screen_resolution = st.selectbox('Screen_
 Aesolution',['1920x1080','1366x768','1600x900','3840x2160','3200x1800','2880x1800','2560x16
#cpu
cpu = st.selectbox('CPU',df['Cpu Brand'].unique())
hdd = st.selectbox('HDD(in GB)',[0,128,256,512,1024,2048])
ssd = st.selectbox('SSD(in GB)', [0,8,128,256,512,1024])
gpu = st.selectbox('GPU',df['Gpu Brand Name'].unique())
os = st.selectbox('OS',df['OS'].unique())
if st.button('Predict Price'):
    if touchscreen == 'Yes':
        touchscreen = 1
    else:
        touchscreen = 0
    if ips == 'Yes':
        ips = 1
    else:
        ips = 0
    screen_width= int(screen_resolution.split('x')[0])
    screen_height= int(screen_resolution.split('x')[1])
    ppi = ((screen_width**2) + (screen_height**2))**0.5/inches
    # create the query array
    query = np.
 array([company,typename,ram,weight,touchscreen,ips,ppi,cpu,hdd,ssd,gpu,os],dtype=object).
 \rightarrowreshape(1, -1)
```

```
# make the prediction
        predicted_price = int(np.exp(pipe.predict(query)[0]))
         st.title(f"The predicted price of this configuration is {predicted_price}")
    Writing app.py
[]: wget -q -0 - ipv4.icanhazip.com
    34.168.116.153
[]: streamlit run app.py & npx localtunnel --port 8501
    Collecting usage statistics. To deactivate, set browser.gatherUsageStats to
    false.
      You can now view your Streamlit app in your browser.
      Local URL: http://localhost:8501
      Network URL: http://172.28.0.12:8501
      External URL: http://34.168.116.153:8501
    npx: installed 22 in 7.044s
    your url is: https://common-masks-punch.loca.lt
    /usr/local/lib/python3.10/dist-packages/sklearn/base.py:439: UserWarning: X does
    not have valid feature names, but OneHotEncoder was fitted with feature names
      warnings.warn(
      Stopping...
    ^C
```