```
In [124]:
            import numpy as np
            import pandas as pd
            import matplotlib.pyplot as plt
            import seaborn as sns
            import plotly.graph_objs as go
            import plotly.offline as py
            import matplotlib.ticker as mtick
            plt.style.use('fivethirtyeight')
            from sklearn.linear_model import LogisticRegression
            from sklearn.linear_model import LinearRegression
            from sklearn.tree import ExtraTreeRegressor
            from sklearn.model_selection import train_test_split
            import warnings
            warnings.filterwarnings('ignore')
            %matplotlib inline
In [125]: data=pd.read_csv('zomato.csv')
In [126]:
            data.head()
Out[126]:
                                                    url
                                                              address
                                                                         name online_order book_table
                                                         942, 21st Main
                                                            Road, 2nd
                     https://www.zomato.com/bangalore/jalsa-
             0
                                                               Stage,
                                                                          Jalsa
                                                                                        Yes
                                                                                                   Yes 4
                                              banasha...
                                                         Banashankari,
                                                          2nd Floor, 80
                    https://www.zomato.com/bangalore/spice-
                                                            Feet Road,
                                                                         Spice
             1
                                                                                        Yes
                                                                                                    No 4
                                                             Near Big
                                                                      Elephant
                                              elephan...
                                                         Bazaar, 6th ...
                                                          1112, Next to
                                                                           San
                                                         KIMS Medical
                https://www.zomato.com/SanchurroBangalore?
                                                                        Churro
                                                                                        Yes
                                                                                                    No 3
                                                          College, 17th
                                                 cont...
                                                                          Cafe
                                                              Cross...
                                                             1st Floor,
                                                                       Addhuri
                  https://www.zomato.com/bangalore/addhuri-
                                                          Annakuteera,
             3
                                                                                                    No 3
                                                                         Udupi
                                                                                        No
                                                udupi...
                                                            3rd Stage,
                                                                       Bhojana
                                                        Banashankar...
                                                          10, 3rd Floor,
                    https://www.zomato.com/bangalore/grand-
                                                              Lakshmi
                                                                         Grand
                                                                                        No
                                                                                                    No 3
                                                village...
                                                           Associates.
                                                                        Village
                                                         Gandhi Baza...
In [127]:
            data.shape
Out[127]: (51717, 17)
```

```
In [128]: | data.columns
Out[128]: Index(['url', 'address', 'name', 'online_order', 'book_table', 'rate', 'vote
                  'phone', 'location', 'rest_type', 'dish_liked', 'cuisines',
                  'approx_cost(for two people)', 'reviews_list', 'menu_item',
                  'listed_in(type)', 'listed_in(city)'],
                 dtype='object')
In [129]: |data.dtypes
Out[129]: url
                                           object
          address
                                           object
          name
                                           object
          online_order
                                           object
          book_table
                                           object
                                           object
           rate
          votes
                                            int64
                                           object
          phone
                                           object
          location
          rest_type
                                           object
          dish_liked
                                           object
          cuisines
                                           object
          approx_cost(for two people)
                                           object
           reviews_list
                                           object
          menu_item
                                           object
          listed_in(type)
                                           object
           listed_in(city)
                                           object
          dtype: object
In [130]: | data.drop(['url', 'phone'], axis=1, inplace=True)
In [131]: data.duplicated().sum()
Out[131]: 43
In [132]: | data.drop_duplicates(inplace=True)
In [133]: data.duplicated().sum()
Out[133]: 0
In [134]: | data.dropna(how='any',inplace=True)
```

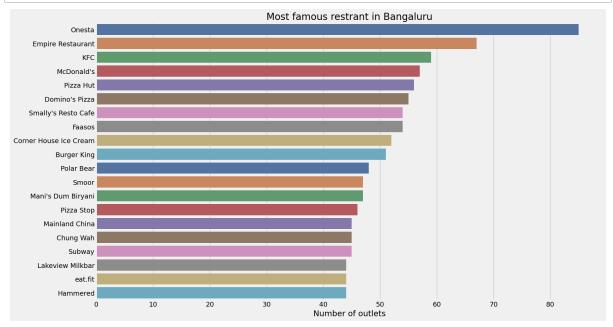
```
In [135]: | data.isnull().sum()
Out[135]: address
                                          0
          name
                                          0
          online_order
                                          0
          book table
                                          0
          rate
                                          0
          votes
                                          0
          location
                                          0
          rest_type
                                          0
          dish_liked
                                          0
          cuisines
                                          0
          approx cost(for two people)
                                          0
          reviews list
                                          0
          menu_item
                                          0
          listed_in(type)
                                          0
          listed_in(city)
                                          0
          dtype: int64
In [136]: data.columns
Out[136]: Index(['address', 'name', 'online_order', 'book_table', 'rate', 'votes',
                  'location', 'rest_type', 'dish_liked', 'cuisines',
                  'approx_cost(for two people)', 'reviews_list', 'menu_item',
                  'listed_in(type)', 'listed_in(city)'],
                dtype='object')
In [137]:
          data.rename(columns={'approx_cost(for two people)':'cost','rate':'rating','lis
In [138]: data.columns
Out[138]: Index(['address', 'name', 'online_order', 'book_table', 'rating', 'votes',
                  'location', 'rest_type', 'dish_liked', 'cuisines', 'cost',
                  'reviews_list', 'menu_item', 'type', 'city'],
                dtype='object')
In [139]: #as we can see there, two values seperated from each other it means that there
          #that are reason for change in its datatype from "Int" to "Object" so we have i
          #values are removed
          data['cost'].unique()
Out[139]: array(['800', '300', '600', '700', '550', '500', '450', '650', '400',
                  '750', '200', '850', '1,200', '150', '350', '250', '1,500',
                  '1,300', '1,000', '100', '900', '1,100', '1,600', '950', '230',
                 '1,700', '1,400', '1,350', '2,200', '2,000', '1,800', '1,900',
                  '180', '330', '2,500', '2,100', '3,000', '2,800', '3,400', '40',
                 '1,250', '3,500', '4,000', '2,400', '1,450', '3,200', '6,000',
                                   '2,300', '120', '2,600', '5,000', '3,700',
                  '1,050', '4,100',
                  '1,650', '2,700', '4,500'], dtype=object)
```

```
In [140]: data['cost']=data['cost'].apply(lambda x: x.replace(',',''))
           data['cost']=data['cost'].astype(float)
In [141]: |data['cost'].dtypes
Out[141]: dtype('float64')
In [142]: data['cost'].unique()
Out[142]: array([ 800.,
                            300., 600., 700., 550., 500., 450., 650., 400.,
                            200., 850., 1200., 150., 350., 250., 1500., 1300.,
                    750.,
                   1000., 100., 900., 1100., 1600., 950., 230., 1700., 1400.,
                   1350., 2200., 2000., 1800., 1900., 180., 330., 2500., 2100.,
                   3000., 2800., 3400., 40., 1250., 3500., 4000., 2400., 1450.,
                   3200., 6000., 1050., 4100., 2300., 120., 2600., 5000., 3700.,
                   1650., 2700., 4500.])
In [143]: data['rating'].unique()
Out[143]: array(['4.1/5', '3.8/5', '3.7/5', '4.6/5', '4.0/5', '4.2/5', '3.9/5',
                   '3.0/5', '3.6/5', '2.8/5', '4.4/5', '3.1/5', '4.3/5', '2.6/5',
                   '3.3/5', '3.5/5', '3.8 /5',
                                                 '3.2/5', '4.5/5', '2.5/5',
                                                                               '2.9/5',
                   '3.4/5', '2.7/5', '4.7/5', 'NEW', '2.4/5', '2.2/5', '2.3/5',
                   '4.8/5', '3.9 /5', '4.2 /5', '4.0 /5', '4.1 /5', '2.9 /5', '2.7 /5', '2.5 /5', '2.6 /5', '4.5 /5', '4.3 /5', '3.7 /5',
                   '4.4 /5', '4.9/5', '2.1/5', '2.0/5', '1.8/5', '3.4 /5', '3.6 /5',
                   '3.3 /5', '4.6 /5', '4.9 /5', '3.2 /5', '3.0 /5', '2.8 /5', '3.5 /5', '3.1 /5', '4.8 /5', '2.3 /5', '4.7 /5', '2.4 /5',
                   '2.1 /5', '2.2 /5', '2.0 /5', '1.8 /5'], dtype=object)
In [144]: | data=data.loc[data.rating !='NEW']
In [145]: | data['rating'].unique()
Out[145]: array(['4.1/5', '3.8/5', '3.7/5', '4.6/5', '4.0/5', '4.2/5', '3.9/5',
                   '3.0/5', '3.6/5', '2.8/5', '4.4/5', '3.1/5', '4.3/5', '2.6/5',
                   '3.3/5', '3.5/5', '3.8 /5'
                                                 '3.2/5', '4.5/5',
                                                                     '2.5/5'
                   '3.4/5', '2.7/5', '4.7/5', '2.4/5', '2.2/5', '2.3/5', '4.8/5',
                   '3.9 /5', '4.2 /5', '4.0 /5', '4.1 /5', '2.9 /5', '2.7 /5',
                   '2.5 /5', '2.6 /5', '4.5 /5', '4.3 /5',
                                                              '3.7 /5', '4.4 /5',
                   '4.9/5', '2.1/5', '2.0/5', '1.8/5', '3.4 /5', '3.6 /5', '3.3 /5',
                   '4.6 /5', '4.9 /5', '3.2 /5', '3.0 /5', '2.8 /5', '3.5 /5', '3.1 /5', '4.8 /5', '2.3 /5', '4.7 /5', '2.4 /5', '2.1 /5',
                   '2.2 /5', '2.0 /5', '1.8 /5'], dtype=object)
```

```
In [146]: data.isnull().sum()
Out[146]: address
                                    0
              name
                                    0
              online_order
                                    0
              book_table
                                    0
              rating
                                    0
              votes
                                    0
              location
                                    0
              rest_type
                                    0
              dish_liked
                                    0
              cuisines
              cost
              reviews_list
                                    0
                                    0
              menu_item
                                    0
              type
              city
              dtype: int64
In [147]: | data['rating']=data['rating'].apply(lambda x: x.replace('/5',''))
In [148]: | data['rating'].unique()
Out[148]: array(['4.1', '3.8', '3.7', '4.6', '4.0', '4.2', '3.9', '3.0', '3.6',
                        '2.8', '4.4', '3.1', '4.3', '2.6', '3.3', '3.5', '3.8 ', '3.2',
                        '4.5', '2.5', '2.9', '3.4', '2.7', '4.7', '2.4', '2.2',
                       '4.8', '3.9 ', '4.2 ', '4.0 ', '4.1 ', '2.9 ', '2.7 ', '2.5 ', '2.6 ', '4.5 ', '4.3 ', '3.7 ', '4.4 ', '4.9', '2.1', '2.0', '1.8', '3.4 ', '3.6 ', '3.3 ', '4.6 ', '4.9 ', '3.2 ', '3.0 ', '2.8 ', '3.5 ', '3.1 ', '4.8 ', '2.3 ', '4.7 ', '2.4 ', '2.1 ', '2.2 ',
                        '2.0 ', '1.8 '], dtype=object)
```

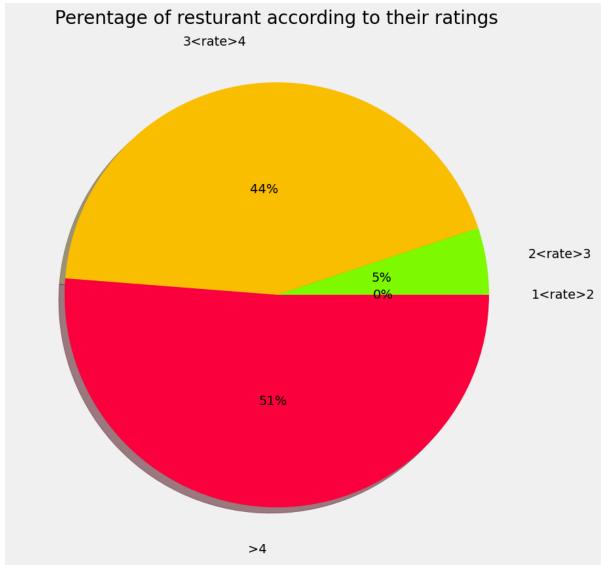
## **Visualizations**

```
In []:
In [149]: #first of all we will check the most famous returant in Bangaluru
```





```
plt.figure(figsize=(9,7))
In [153]:
           sns.distplot(data['rating'],bins=20)
           plt.show()
               1.6
               1.4
              1.2
              1.0
            Density
°°
              0.6
               0.4
In [154]: data['rating'].min()
Out[154]: '1.8'
In [155]: data['rating'].max()
Out[155]: '4.9 '
In [156]: data['rating']=data['rating'].astype(float)
In [157]: data['rating'].dtypes
Out[157]: dtype('float64')
In [158]: ((data['rating'] >= 1) & (data['rating'] < 2)).sum()</pre>
Out[158]: 5
In [159]: ((data['rating']>=2) & (data['rating']<3)).sum()</pre>
Out[159]: 1179
In [160]: ((data['rating']>=3)& (data['rating']<4)).sum()</pre>
Out[160]: 10153
```



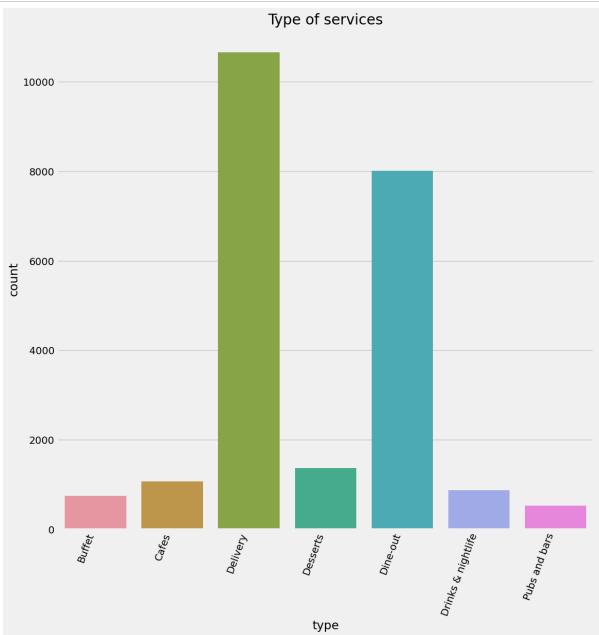
```
In [163]: ax = sns.countplot(x='type', data=data)

# Rotate the x-tick labels
ax.set_xticklabels(ax.get_xticklabels(), rotation=70, ha='right')

# Set the figure size
fig = plt.gcf()
fig.set_size_inches(12, 12)

# Set the title
plt.title('Type of services')

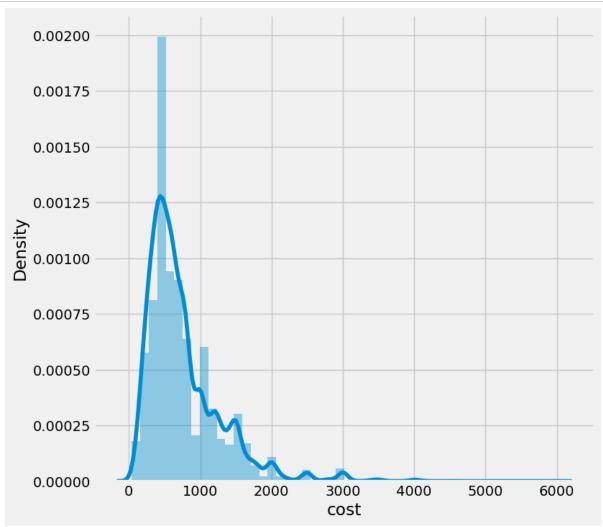
# Show the plot
plt.show()
```



```
In [164]: #Distribution of cost of food for two people
```

localhost:8888/notebooks/Documents/Data Science/Projects'/End to end Resturant rating prediction/Restaurant rating prediction.ipynb

```
In [169]: plt.figure(figsize=(8,8))
    sns.distplot(data['cost'])
    plt.show()
```



```
In [171]: import re

data.index=range(data.shape[0])
likes=[]
for i in range(data.shape[0]):
    array_split=re.split(',',data['dish_liked'][i])
    for item in array_split:
        likes.append(item)
```

```
In [172]: data.index=range(data.shape[0])
In [173]: data.index
```

Out[173]: RangeIndex(start=0, stop=23248, step=1)

```
print("Count the most liked dishes in Bangaluru")
In [179]:
          fav_food=pd.Series(likes).value_counts()
          fav_food.head(30)
```

hes in Bangaluru

	Count the most	liked dish
Out[179]:	Pasta	2692
	Pizza	1915
	Cocktails	1880
	Burgers	1736
	Mocktails	1623
	Biryani	1307
	Sandwiches	1287
	Burgers	1256
	Coffee	1184
	Nachos	1170
	Fish	1116
	Paratha	1107
	Salads	1055
	Chicken Biryan	i 1004
	Cocktails	891
	Fries	876
	Noodles	854

729

726

677

672

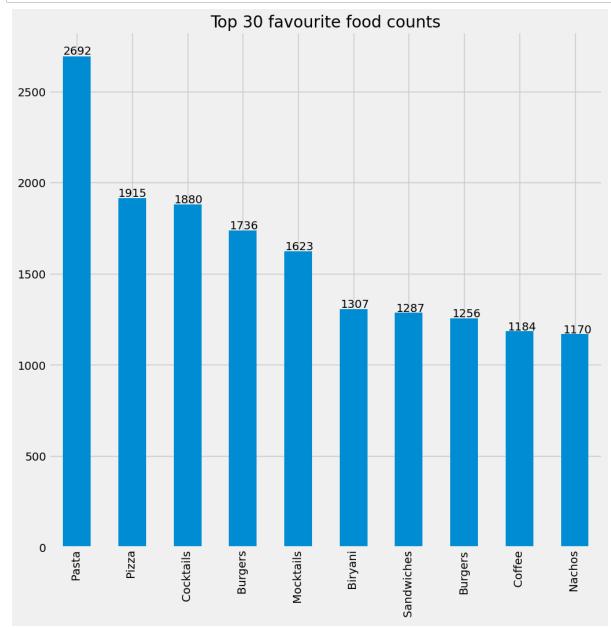
dtype: int64

Hot Chocolate

Roti

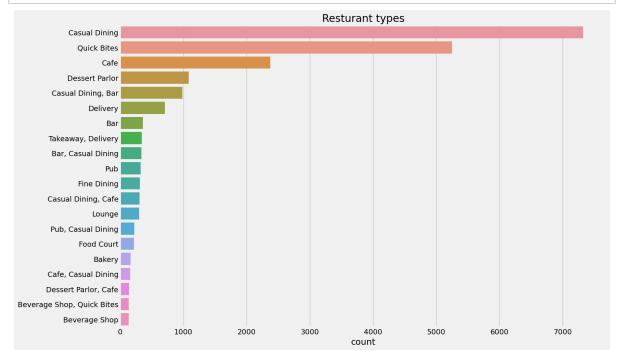
Salad

Brownie



In [183]: #Resturants and there counts

```
In [189]: plt.figure(figsize=(15,10))
    rest=data['rest_type'].value_counts()[:20]
    sns.barplot(y=rest.index,x=rest,orient='h')
    plt.title('Resturant types')
    plt.xlabel("count")
    plt.show()
```



```
In [ ]:
```

In [190]: #Now for model building we have to prepare the data

```
In [191]:
            data.head()
Out[191]:
                     address
                                       online_order book_table rating votes
                                 name
                                                                                   location rest_type
                                                                                                      dish
                942, 21st Main
                    Road, 2nd
                                                                                               Casual
             0
                       Stage,
                                 Jalsa
                                                Yes
                                                            Yes
                                                                   4.1
                                                                               Banashankari
                                                                                               Dining
                Banashankari,
                                                                                                         Ν
                  2nd Floor, 80
                   Feet Road,
                                 Spice
                                                                                               Casual
             1
                                                Yes
                                                            No
                                                                   4.1
                                                                         787
                                                                               Banashankari
                              Elephant
                                                                                               Dining
                     Near Big
                                                                                                       Cho
                 Bazaar, 6th ...
                                                                                                        Ν
                                                                                                        Tł
                                                                                                        CI
                  1112, Next to
                                                                                                Cafe.
                                                                                                      Canı
                                  San
                 KIMS Medical
             2
                                Churro
                                                Yes
                                                            No
                                                                   3.8
                                                                         918
                                                                               Banashankari
                                                                                               Casual
                                                                                                      Mine
                 College, 17th
                                  Cafe
                                                                                               Dining
                                                                                                       Sou
                      Cross...
                     1st Floor,
                               Addhuri
                 Annakuteera,
                                                                                               Quick
                                 Udupi
                                                No
                                                            No
                                                                   3.7
                                                                               Banashankari
                    3rd Stage,
                                                                                                Bites
                               Bhojana
                Banashankar...
                  10, 3rd Floor,
                     Lakshmi
                                 Grand
                                                                                               Casual
                                                                                                        Pε
                                                No
                                                            No
                                                                   3.8
                                                                         166
                                                                              Basavanagudi
                   Associates.
                                Village
                                                                                               Dining
                                                                                                      Gol
                Gandhi Baza...
In [192]:
            data.online order[data.online order=='Yes']=1
            data.online_order[data.online_order=='No']=0
            data['online_order'].value_counts()
In [193]:
Out[193]:
            1
                  16378
                   6870
            Name: online_order, dtype: int64
            data.book_table[data.book_table=='Yes']=1
In [194]:
            data.book table[data.book table=='No']=0
In [195]:
            data['book_table'].value_counts()
Out[195]:
            0
                  17191
                   6057
            Name: book_table, dtype: int64
In [197]:
            from sklearn.preprocessing import LabelEncoder
            le=LabelEncoder()
```

```
In [198]:
            data['location']=le.fit_transform(data['location'])
            data['rest_type']=le.fit_transform(data['rest_type'])
            data['cuisines']=le.fit_transform(data['cuisines'])
            data['menu_item']=le.fit_transform(data['menu_item'])
In [199]:
            data.head()
Out[199]:
                      address
                                  name online order book table rating votes location rest type dish like
                                                                                                        Pasta
                 942, 21st Main
                                                                                                        Lunc
                    Road, 2nd
                                                                                                        Buffe
             0
                        Stage,
                                  Jalsa
                                                   1
                                                                     4.1
                                                                           775
                                                                                       1
                                                                                                20
                                                                                                       Masala
                 Banashankari,
                                                                                                       Papac
                                                                                                       Panee
                                                                                                        Laja.
                                                                                                       Momos
                  2nd Floor, 80
                                                                                                        Lunc
                    Feet Road,
                                                                                                        Buffe
                                  Spice
              1
                                                   1
                                                               0
                                                                     4.1
                                                                           787
                                                                                                20
                      Near Big
                               Elephant
                                                                                                     Chocolate
                 Bazaar, 6th ...
                                                                                                      Nirvana
                                                                                                      Thai G.
                                                                                                      Churros
                  1112, Next to
                                   San
                                                                                                    Cannellon
                 KIMS Medical
              2
                                 Churro
                                                   1
                                                               0
                                                                     3.8
                                                                           918
                                                                                                    Minestron
                  College, 17th
                                   Cafe
                                                                                                     Soup, Ho
                       Cross...
                                                                                                        Choc.
                     1st Floor,
                                Addhuri
                  Annakuteera,
                                                                                                       Masala
                                                   0
                                                               0
                                                                     3.7
                                                                                                62
              3
                                  Udupi
                                                                            88
                    3rd Stage,
                                                                                                         Dos
                                Bhojana
                 Banashankar...
                  10, 3rd Floor,
                      Lakshmi
                                 Grand
                                                                                                      Panipur
              4
                                                   0
                                                               0
                                                                     3.8
                                                                           166
                                                                                                20
                                                                                                    Gol Gapp
                    Associates,
                                 Village
                 Gandhi Baza...
In [200]:
            my_data=data.iloc[:,[2,3,4,5,6,7,9,10,12]]
            my_data.to_csv('zomato_df.csv')
In [201]:
            x=data.iloc[:,[2,3,5,6,7,9,10,12]]
            x.head()
Out[201]:
                 online_order book_table votes location rest_type cuisines
                                                                               cost menu_item
             0
                           1
                                       1
                                            775
                                                       1
                                                                20
                                                                        1386
                                                                              800.0
                                                                                           5047
              1
                           1
                                       0
                                            787
                                                       1
                                                                 20
                                                                              800.0
                                                                                           5047
                                                                         594
              2
                           1
                                       0
                                            918
                                                                 16
                                                                              800.0
                                                                                           5047
                                                                         484
                           0
                                       0
                                             88
                                                       1
                                                                 62
              3
                                                                        1587
                                                                              300.0
                                                                                           5047
                           0
                                       0
                                            166
                                                       4
                                                                 20
                                                                        1406 600.0
                                                                                           5047
```

```
In [204]: y=data['rating']
```

```
In [205]: x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.20,random_state
```

# LinearRegression

```
In [206]: lr=LinearRegression()
lr.fit(x_train,y_train)
```

Out[206]: LinearRegression()

In a Jupyter environment, please rerun this cell to show the HTML representation or trust the notebook

On GitHub, the HTML representation is unable to render, please try loading this page with nbviewer.org.

```
In [207]: from sklearn.metrics import r2_score
    y_pred=lr.predict(x_test)
    r2_score(y_test,y_pred)
```

Out[207]: 0.22762342262807467

#### RandomForest

Out[209]: 0.8920067629047455

# **ExtraTreesRegressor**

```
In [211]: from sklearn.ensemble import ExtraTreesRegressor
    et=ExtraTreesRegressor(n_estimators=120)
    et.fit(x_train,y_train)
    y_pred=et.predict(x_test)
    r2_score(y_pred,y_test)
```

Out[211]: 0.9299835257201194

### **Pickle**

#Use pickle to save our model so that we can use it later

```
In [212]: import pickle
    pickle.dump(et,open('model.pkl','wb'))
    model=pickle.load(open('model.pkl','rb'))
```