```
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
import seaborn as sns
from sklearn.model_selection import train_test_split
from sklearn.ensemble import RandomForestClassifier, GradientBoostingClassifier
from sklearn.tree import DecisionTreeClassifier
from sklearn.neighbors import KNeighborsClassifier
from sklearn.metrics import f1 score, classification report, confusion matrix
import warnings
import pickle
from scipy import stats
warnings.filterwarnings('ignore')
plt.style.use('fivethirtyeight')
data = pd.read_csv("/content/sample_data/Data_Train.csv")
data.head()
data.shape
data.isnull().sum()
data.dropna(inplace=True)
data.isnull().sum()
Category = ['Airline', 'Source', 'Destination', 'Additional_Info']
for i in Category:
    print(i, data[i].unique())
category_cols=data.select_dtypes (include=['object']) .columns
category cols
#plotting a barchart for each of the categorical value
#for column in category_cols:
  #plt.figure(figsize=(20,4))
  #plt.subplot(121)
  #data[column].value_counts().plot(kind='bar')
  #plt.title(column)
data.Route = data.Route.str.split('->')
data['City1']=data.Route.str[0]
data['City2']=data.Route.str[1]
data['City3']=data. Route.str[2]
data['City4']=data. Route.str[3]
data['City5']=data.Route.str[4]
data['City6']=data. Route.str[5]
data.Date_of_Journey=data.Date_of_Journey.str.split('/')
data.Date_of_Journey
#Treating the data_column
data['Date']=data.Date_of_Journey.str[0]
data['Month'] = data.Date_of_Journey.str[1]
data['Year']=data.Date of Journey.str[2]
data.Dep Time=data.Dep Time.str.split(':')
data['Dep Time Hour']=data.Dep Time.str[0]
data['Dep Time Mins']=data.Dep Time.str[1]
data.Arrival Time=data.Arrival Time.str.split(' ')
data['Arrival_date']=data.Arrival_Time.str[1]
data['Time_of_Arrival']=data. Arrival_Time.str[0]
data['Time_of_Arrival']=data.Time_of_Arrival.str.split(':')
data['Arrival_Time_Hour' ]=data.Time_of_Arrival.str[0]
data['Arrival_Time_Mins']=data.Time_of_Arrival.str[1]
#Next, we divide the 'Duration' column to 'Travel_hours' and Travel_mins'
data.Duration=data.Duration.str.split(' ')
data['Travel Hours']=data.Duration.str[0]
data['Travel_Hours']=data['Travel_Hours'].str.split('h')
data['Travel_Hours']=data['Travel_Hours'].str[0]
data.Travel_Hours = data. Travel_Hours
data['Travel_Mins']=data.Duration.str[1]
#Next, we divide the 'Duration' column to 'Travel hours' and Travel mins'
data.Duration=data.Duration.str.split(' ')
```

```
Airline ['IndiGo' 'Air India' 'Jet Airways' 'SpiceJet' 'Multiple carriers' 'GoAir'
      'Vistara' 'Air Asia' 'Vistara Premium economy' 'Jet Airways Business'
     'Multiple carriers Premium economy' 'Trujet']
     Source ['Banglore' 'Kolkata' 'Delhi' 'Chennai' 'Mumbai']
     Destination ['New Delhi' 'Banglore' 'Cochin' 'Kolkata' 'Delhi' 'Hyderabad']
     Additional Info ['No info' 'In-flight meal not included' 'No check-in baggage included'
      '1 Short layover' 'No Info' '1 Long layover' 'Change airports'
      'Business class' 'Red-eye flight' '2 Long layover']
data['Duration'] = data['Duration'].astype(str)
data['Travel_Hours']=data.Duration.str[0]
data['Travel_Hours']=data['Travel_Hours'].str.split('h')
data['Travel_Hours']=data['Travel_Hours'].str[0]
data.Travel_Hours =data.Travel_Hours
data['Travel_Mins']=data.Duration.str[1]
data. Travel_Mins=data.Travel_Mins.str.split('m')
data.Travel_Mins=data.Travel_Mins.str[0]
data. Total_Stops.replace('non_stop', 0, inplace=True)
data. Total_Stops = data. Total_Stops.str.split(' ')
data. Total_Stops=data. Total_Stops.str[0]
data. Additional Info.unique()
     array(['No info', 'In-flight meal not included',
            'No check-in baggage included', '1 Short layover', 'No Info',
            '1 Long layover', 'Change airports', 'Business class', 'Red-eye flight', '2 Long layover'], dtype=object)
data. Additional_Info.replace('No Info', 'No info', inplace=True)
data.isnull().sum
if 'City4' in data.columns and 'City5' in data.columns and 'City6' in data.columns:
    data.drop(['City4', 'City5', 'City6'], axis=1, inplace=True)
print(data.columns)
     'Year', 'Dep_Time_Hour', 'Dep_Time_Mins', 'Arrival_date',
            'Time_of_Arrival', 'Arrival_Time_Hour', 'Arrival_Time_Mins',
            'Travel_Hours', 'Travel_Mins'],
           dtype='object')
data.drop(['Date_of_Journey','Route', 'Dep_Time','Arrival_Time','Duration'], axis=1, inplace=True)
data.drop(['Time of Arrival'], axis=1, inplace=True)
data.isnull().sum()
data.info()
data['City3'].fillna ('None', inplace=True)
data['City2'].fillna ('None', inplace=True)
data['Arrival_date'].fillna (data['Date'], inplace=True)
data['Travel_Mins'].fillna(0,inplace=True)
data.info()
```

data[data['Travel Hours']=='5m']

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data.info()

2 3

4

6

7

8

9

Airline Source Destination Total\_Stops Additional\_Info Price City1 City2 City3 Date Month Year Dep

```
data.Travel_Hours=data.Travel_Hours.astype('int64')
                                               Traceback (most recent call last)
     <ipython-input-322-7bece7b89a9b> in <cell line: 1>()
     ----> 1 data.Travel_Hours=data.Travel_Hours.astype('int64')
                                       7 frames
     /usr/local/lib/python3.9/dist-packages/pandas/_libs/lib.pyx in pandas._libs.lib.astype_intsafe()
     ValueError: invalid literal for int() with base 10: 'n'
      SEARCH STACK OVERFLOW
categorical=['Airline', 'Source', 'Destination', 'Additional Info', 'City1']
```

l\_Stops', 'Date', 'Month', 'Year', 'Dep\_Time\_Hour', 'Dep\_Time\_Mins', 'Arrival\_date', 'Arrival\_Time\_Hour', 'Arrival\_T

```
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```

```
import seaborn as sns
c=1
plt.figure(figsize=(20,45))
for i in categorical:
   plt.subplot(6,3,c)
   sns.scatterplot(x=data[i],y=data.Price)
   plt.xticks(rotation=90)

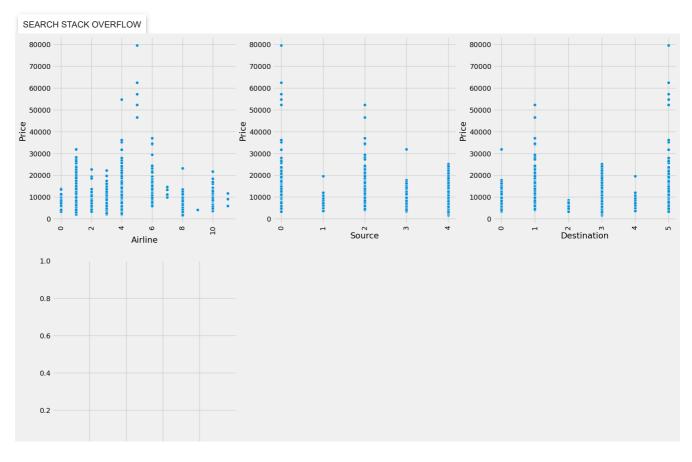
   c=c+1
plt.show()
```

```
KeyError
                                          Traceback (most recent call last)
/usr/local/lib/python3.9/dist-packages/pandas/core/indexes/base.py in get_loc(self, key, method, tolerance)
                        return self._engine.get_loc(casted_key)
-> 3629
   3630
                    except KeyError as err:
                                   2 4 frames
pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item()
pandas/_libs/hashtable_class_helper.pxi in pandas._libs.hashtable.PyObjectHashTable.get_item()
KeyError: 'Additional Info'
The above exception was the direct cause of the following exception:
KeyError
                                          Traceback (most recent call last)
/usr/local/lib/python3.9/dist-packages/pandas/core/indexes/base.py in get_loc(self, key, method, tolerance)
                        return self._engine.get_loc(casted_key)
                    except KeyError as err:
   3630
                        raise KeyError(key) from err
-> 3631
   3632
                    except TypeError:
```

# If we have a listlike key, \_check\_indexing\_error will raise

KeyError: 'Additional Info'

3633

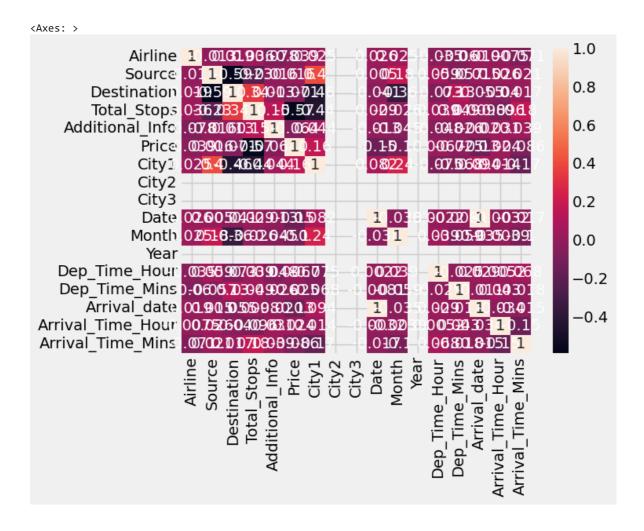


pd.set\_option('display.max\_columns',25)

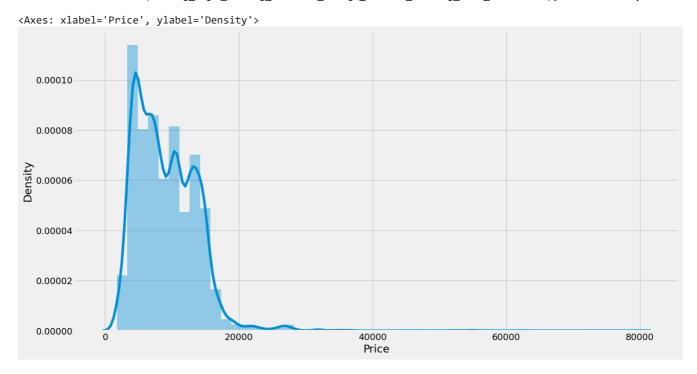
data.head()

	Airline	Source	Destination	Total_Stops	Additional_1	Σnfo	Price	City1	City2	City3	Date	Month	Year	Dŧ
0	3	0	5	4		7	3897	18	0	0	24	3	2019	
1	1	3	0	1		7	7662	84	0	0	1	5	2019	
2	4	2	1	1		7	13882	118	0	0	9	6	2019	
3	3	3	0	0		7	6218	91	0	0	12	5	2019	
4	3	0	5	0		7	13302	29	0	0	1	3	2019	
4														<b>•</b>

data['Year'].max()
sns.heatmap (data.corr(), annot=True)

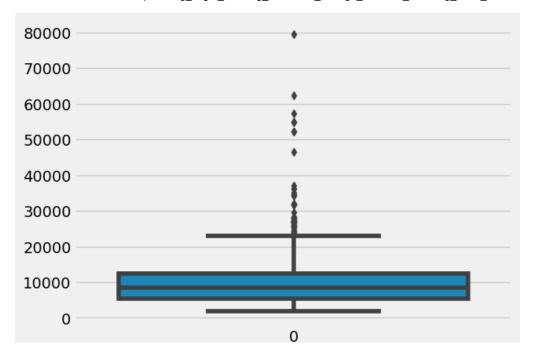


plt.figure(figsize=(15,8))
sns.distplot(data.Price)



```
import seaborn as sns
sns.boxplot(data['Price'])

c=1
for i in numerical:
  plt.figure(figsize=(10,20))
  plt.subplot(6,3,c)
  sns.scatterplot(x = data[i], y=data.Price)
  plt.xticks(rotation=90)
#plt. tight_Layout (pad=3.0)
  C=c+1
plt.show()
```



```
from sklearn.preprocessing import LabelEncoder
le = LabelEncoder()
data.Airline = le.fit_transform (data. Airline)
data.Source = le.fit_transform(data.Source)
data.Destination = le.fit_transform(data. Destination)
data.Total_Stops= le.fit_transform(data. Total_Stops)
data.City1=le.fit_transform(data.City1)
data.City2=le.fit_transform(data.City2)
data.City3=le.fit_transform(data.City3)
data.Additional_Info = le.fit_transform(data. Additional_Info)
data.head()
data.head()
```

	Airline	Source	Destination	Total_Stops	Additional_Info	Price	City1	City2	City3	Date	Month	Year	De
0	3	0	5	4	7	3897	18	0	0	24	3	2019	
1	1	3	0	1	7	7662	84	0	0	1	5	2019	
2	4	2	1	1	7	13882	118	0	0	9	6	2019	
3	3	3	0	0	7	6218	91	0	0	12	5	2019	
4	3	0	5	0	7	13302	29	0	0	1	3	2019	
4	2000												•

data = data[['Airline', 'Source', 'Destination', 'Date', 'Month', 'Year', 'Dep\_Time\_Hour', 'Dep\_Time\_Mins','Arrival\_
data.head()

	Airline	Source	Destination	Date	Month	Year	Dep_Time_Hour	<pre>Dep_Time_Mins</pre>	Arrival_date	Arrival_Time_Ho
0	3	0	5	24	3	2019	22	20	22	
1	1	3	0	1	5	2019	5	50	1	
2	4	2	1	9	6	2019	9	25	10	
3	3	3	0	12	5	2019	18	5	12	
4	3	0	5	1	3	2019	16	50	1	
4										<b>&gt;</b>
	2000	∩				_				

### Scaling the Data

 $from \ sklearn.preprocessing \ import \ StandardScaler$ 

ss = StandardScaler()

datal = ss.fit\_transform(data)

```
datal = pd.DataFrame(datal, columns=data.columns)
datal.head()
```

	Airline	Source	Destination	Date	Month	Year	Dep_Time_Hour	<pre>Dep_Time_Mins</pre>	Arrival_date	Arri
0	-0.410934	-1.658354	2.416648	1.237192	-1.467619	0.0	1.654162	-0.234832	0.955658	
1	-1.261305	0.890262	-0.973718	-1.475375	0.250165	0.0	-1.303018	1.363790	-1.524701	
2	0.014251	0.040723	-0.295645	-0.531874	1.109057	0.0	-0.607211	0.031605	-0.461690	
3	-0.410934	0.890262	-0.973718	-0.178060	0.250165	0.0	0.958355	-1.034142	-0.225465	
4	-0.410934	-1.658354	2.416648	-1.475375	-1.467619	0.0	0.610452	1.363790	-1.524701	
4				J						<b>&gt;</b>

```
y = datal['Price']
x = datal.drop(columns = ['Price'], axis=1)

from sklearn.model_selection import train_test_split
x_train,x_test,y_train,y_test = train_test_split(x,y,test_size=0.2, random_state=42)
```

x\_train.head()

	Airline	Source	Destination	Date	Month	Year	Dep_Time_Hour	Dep_Time_Mins	Arrival_date	A
10609	0.014251	1.739800	1.060501	0.529566	0.250165	0.0	-0.955114	-1.034142	0.483209	
1034	1.714993	0.040723	-0.295645	1.237192	-0.608727	0.0	0.436500	1.097353	1.191883	
8122	0.014251	0.040723	-0.295645	1.591005	1.109057	0.0	-1.824873	-0.501269	1.546220	
4779	0.014251	0.890262	-0.973718	-1.475375	-0.608727	0.0	-1.129066	0.298042	-1.524701	
3207	-0.410934	0.890262	-0.973718	1.237192	0.250165	0.0	0.958355	-1.034142	1.191883	
4										•

```
x_train.shape
```

```
(8544, 11)
```

```
- 40000 ·
from sklearn.ensemble import RandomForestRegressor, GradientBoostingRegressor, AdaBoostRegressor
rfr = RandomForestRegressor()
gb = GradientBoostingRegressor()
ad = AdaBoostRegressor()
from sklearn.metrics import r2_score,mean_absolute_error,mean_squared_error
for i in [rfr, gb,ad]:
 i.fit(x_train,y_train)
 y_pred=i.predict(x_test)
  test_score=r2_score (y_test,y_pred)
  train_score=r2_score (y_train, i.predict(x_train))
if abs (train_score-test_score)<=0.2:</pre>
 print(i)
print("R2 score is", r2_score (y_test,y_pred))
print("R2 for train data", r2_score (y_train, i.predict(x_train)))
print("Mean Absolute Error is", mean_absolute_error(y_pred,y_test))
print("Mean Squared Error is", mean_squared_error(y_pred,y_test))
print("Root Mean Squared Error is", (mean_squared_error(y pred,y_test, squared=False)))
     AdaBoostRegressor()
     R2 score is 0.1920075019031262
     R2 for train data 0.2397620967213413
     Mean Absolute Error is 0.7474281430734462
     Mean Squared Error is 0.8023576762712405
     Root Mean Sqaured Error is 0.8957442024770468
```

```
from sklearn.neighbors import KNeighborsRegressor
```

from sklearn.svm import SVR

from sklearn.tree import DecisionTreeRegressor

```
from sklearn.metrics import r2_score, mean_absolute_error, mean_squared_error
knn=KNeighborsRegressor()
svr=SVR()
dt=DecisionTreeRegressor()
for i in [knn, svr,dt]:
  i.fit(x_train,y_train)
  y_pred=i.predict(x_test)
  test_score=r2_score (y_test,y_pred)
  train_score=r2_score (y_train,i.predict(x_train))
  if abs(train_score-test_score)<=0.1:</pre>
    print(i)
    print('R2 Score is', r2_score (y_test,y_pred))
    print('R2 Score for train data', r2_score (y_train, i.predict(x_train)))
    print('Mean Absolute Error is', mean_absolute_error(y_test,y_pred))
    print('Mean Squared Error is', mean_squared_error(y_test,y_pred))
    print('Root Mean Squared Error is', (mean_squared_error(y_test, y_pred, squared=False)))
     KNeighborsRegressor()
     R2 Score is 0.7357369816529409
     R2 Score for train data 0.7900498333828809
     Mean Absolute Error is 0.35463454315938664
     Mean Squared Error is 0.26242008660326566
     Root Mean Squared Error is 0.512269544871902
     SVR()
     R2 Score is 0.6399736388140904
     R2 Score for train data 0.5969176412610055
     Mean Absolute Error is 0.40820604052912457
     Mean Squared Error is 0.3575155898574727
     Root Mean Squared Error is 0.5979260739066935
from sklearn.model_selection import cross_val_score
for i in range(2,5):
  cv=cross_val_score (rfr,x,y,cv=i)
  print(rfr,cv.mean())
     RandomForestRegressor() 0.7913041688665847
     RandomForestRegressor() 0.7922244703050666
     RandomForestRegressor() 0.8010036945252192
import tensorflow as tf
from tensorflow import keras
from tensorflow.keras.layers import Dense, Activation, Dropout
from tensorflow.keras.optimizers import Adam
model = keras.Sequential()
model.add(Dense (7, activation = 'relu', input_dim=11))
model.add(Dense (7, activation='relu'))
model.add(Dense(1, activation="linear"))
model.summary()
     Model: "sequential"
```

Layer (type)	Output Shape	Param #
dense (Dense)	(None, 7)	84
dense_1 (Dense)	(None, 7)	56
dense_2 (Dense)	(None, 1)	8
Total params: 148 Trainable params: 148 Non-trainable params: 0		

```
Epoch 2/10
   Epoch 3/10
   Epoch 4/10
   Epoch 5/10
   Epoch 6/10
   Epoch 7/10
   Epoch 8/10
   428/428 [============] - 1s 2ms/step - loss: 0.6749 - mae: 0.6093
   Epoch 9/10
   Fnoch 10/10
   <keras.callbacks.History at 0x7fc48177bdf0>
from sklearn.model_selection import cross_val_score
for i in range(2,5):
 cv=cross_val_score (rfr,x,y,cv=i)
 print (rfr, cv.mean())
from sklearn.model selection import RandomizedSearchCV
param_grid={'n_estimators': [10, 30, 50, 70, 100], 'max_depth': [None, 1, 2, 3], 'max_features': ['auto', 'sqrt']}
rfr=RandomForestRegressor()
rf res = RandomizedSearchCV(estimator=rfr, param distributions=param grid, cv=3, verbose=2,n jobs=-1)
rf res.fit(x train,y train)
   RandomForestRegressor() 0.7909852737870107
   RandomForestRegressor() 0.7935431966039664
   RandomForestRegressor() 0.8004797889513
   Fitting 3 folds for each of 10 candidates, totalling 30 fits
          RandomizedSearchCV
    ▶ estimator: RandomForestRegressor
        ▶ RandomForestRegressor
gb = GradientBoostingRegressor()
# Define parameter grid to search over
param_grid = {
   'n_estimators': [50, 100, 150],
   'max_depth': [3, 5, 7],
   'learning_rate': [0.1, 0.01, 0.001]
}
# Perform randomized search over parameter grid
gb_res = RandomizedSearchCV(estimator=gb, param_distributions=param_grid, cv=3, verbose=2, n_jobs=-1)
gb_res.fit(x_train, y_train)
   Fitting 3 folds for each of 10 candidates, totalling 30 fits
            RandomizedSearchCV
    ▶ estimator: GradientBoostingRegressor
        ▶ GradientBoostingRegressor
      .....
rfr=RandomForestRegressor (n_estimators=10, max_features='sqrt', max_depth=None)
rfr.fit(x_train,y_train)
y_train_pred=rfr.predict(x_train)
y_test_pred=rfr.predict(x_test)
print("train accuracy", r2_score (y_train_pred,y_train))
print("test accuracy", r2_score (y_test_pred,y_test))
```

```
train accuracy 0.9297123116878924
     test accuracy 0.7740524823579749
from sklearn.model_selection import cross_val_score
for i in range(2,5):
  cv=cross_val_score (gb, x,y,cv=i)
  print (rfr, cv.mean())
     RandomForestRegressor(max_features='sqrt', n_estimators=10) 0.72661809392105
     RandomForestRegressor(max_features='sqrt', n_estimators=10) 0.7287548229046766
     RandomForestRegressor(max_features='sqrt', n_estimators=10) 0.728029951483208
gb=GradientBoostingRegressor (n estimators=10, max features='sqrt', max depth=None)
gb.fit(x train,y train)
y train pred=gb.predict(x train)
y test pred=gb.predict(x test)
print("train accuracy", r2_score (y_train_pred,y_train))
print("test accuracy", r2 score (y test pred,y test))
     train accuracy 0.636247261013868
     test accuracy 0.24929533156419104
from sklearn.neighbors import KNeighborsRegressor
from sklearn.svm import SVR
from sklearn.tree import DecisionTreeRegressor
from sklearn.metrics import r2_score, mean_absolute_error, mean_squared_error
knn=KNeighborsRegressor()
svr=SVR()
dt=DecisionTreeRegressor()
for i in [knn, svr,dt]:
  i.fit(x_train,y_train)
  y_pred=i.predict(x_test)
  test_score=r2_score (y_test,y_pred)
  train_score=r2_score (y_train, i.predict(x_train))
  if abs(train_score-test_score)<=0.1:</pre>
    print(i)
     KNeighborsRegressor()
     SVR()
knn=KNeighborsRegressor (n_neighbors=2, algorithm= 'auto', metric_params=None, n_jobs=-1)
knn.fit(x_train,y_train)
y_train_pred-knn.predict(x_train)
y_test_pred-knn.predict(x_test)
print("train accuracy", r2_score (y_train_pred,y_train))
print("test accuracy", r2_score (y_test_pred,y_test))
     train accuracy 0.636247261013868
     test accuracy 0.24929533156419104
from sklearn.model_selection import cross_val_score
for i in range(2,5):
  cv=cross_val_score (knn, x,y,cv=i)
  print (knn, cv.mean())
predicted_values = pd.DataFrame({'Actual' :y_test, 'Predicted' :y_pred})
predicted_values
```

```
KNeighborsRegressor(n_jobs=-1, n_neighbors=2) 0.6306338018391912
KNeighborsRegressor(n_jobs=-1, n_neighbors=2) 0.6447308601134175
KNeighborsRegressor(n_jobs=-1, n_neighbors=2) 0.664555765507016
```

```
Actual Predicted
            -0.349272
      4830
                        -0.455760
      3771
             -0.251459
                        -0.171648
      1523
            -0.677410
                         0.638830
      3393
             1.562086
                         0.826648
      4169
            -0.232157
                        -0.719485
      9869
             -0.968245
                        -0.614949
      10061 -0.354477
                        -0.354477
      0044
                         0 0 4 0 4 0 4
             0 040404
prices=rfr.predict(x_test)
price_list = pd.DataFrame({'Price': prices})
price_list
```

## Price 0 -0.541116 -0.057338 1 2 0.496086 3 0.964626 -0.683179 **2132** -0.614212 **2133** -0.549343 **2134** -0.374603 **2135** 0.738894 **2136** 1.056930

2137 rows × 1 columns

```
import pickle
pickle.dump(rfr,open('model1.pkl','wb'))
from flask import Flask, render_template, request
import numpy as np
import pickle
import pandas as pd
model=pickle.load(open ("model1.pkl",'rb'))
app = Flask (__name__)
@app.route("/")
def home():
  return render_template('/content/Flask/home.html')
@app.route("/content/Flask/predict.html")
def pred():
  return render_template('/content/Flask/predict.html')
@app.route("/pred", methods=['POST', 'GET'])
def predict():
  x = [[int(x) for x in request.form.values()]]
  print(x)
  x = np.array(x)
```