# PROBLEM STATEMENT : Which model is suitable for Flight Price Prediction

## **Importing Packages**

In [2]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns

### **Read The Data**

In [3]: traindf=pd.read\_csv(r"C:\Users\anu\Downloads\Data\_Train 1.csv")
 traindf

Out[3]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Price
0	IndiGo	24/03/2019	Banglore	New Delhi	BLR ? DEL	22:20	01:10 22 Mar	2h 50m	non-stop	No info	3897
1	Air India	1/05/2019	Kolkata	Banglore	CCU ? IXR ? BBI ? BLR	05:50	13:15	7h 25m	2 stops	No info	7662
2	Jet Airways	9/06/2019	Delhi	Cochin	DEL ? LKO ? BOM ? COK	09:25	04:25 10 Jun	19h	2 stops	No info	13882
3	IndiGo	12/05/2019	Kolkata	Banglore	CCU ? NAG ? BLR	18:05	23:30	5h 25m	1 stop	No info	6218
4	IndiGo	01/03/2019	Banglore	New Delhi	BLR ? NAG ? DEL	16:50	21:35	4h 45m	1 stop	No info	13302
10678	Air Asia	9/04/2019	Kolkata	Banglore	CCU?BLR	19:55	22:25	2h 30m	non-stop	No info	4107
10679	Air India	27/04/2019	Kolkata	Banglore	CCU?BLR	20:45	23:20	2h 35m	non-stop	No info	4145
10680	Jet Airways	27/04/2019	Banglore	Delhi	BLR ? DEL	08:20	11:20	3h	non-stop	No info	7229
10681	Vistara	01/03/2019	Banglore	New Delhi	BLR ? DEL	11:30	14:10	2h 40m	non-stop	No info	12648
10682	Air India	9/05/2019	Delhi	Cochin	DEL ? GOI ? BOM ? COK	10:55	19:15	8h 20m	2 stops	No info	11753

10683 rows × 11 columns

In [4]: testdf=pd.read\_csv(r"C:\Users\anu\Downloads\Test\_set.csv")
testdf

Out[4]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info
0	Jet Airways	6/06/2019	Delhi	Cochin	DEL?BOM?COK	17:30	04:25 07 Jun	10h 55m	1 stop	No info
1	IndiGo	12/05/2019	Kolkata	Banglore	CCU ? MAA ? BLR	06:20	10:20	4h	1 stop	No info
2	Jet Airways	21/05/2019	Delhi	Cochin	DEL?BOM?COK	19:15	19:00 22 May	23h 45m	1 stop	In-flight meal not included
3	Multiple carriers	21/05/2019	Delhi	Cochin	DEL?BOM?COK	08:00	21:00	13h	1 stop	No info
4	Air Asia	24/06/2019	Banglore	Delhi	BLR ? DEL	23:55	02:45 25 Jun	2h 50m	non-stop	No info
2666	Air India	6/06/2019	Kolkata	Banglore	CCU? DEL? BLR	20:30	20:25 07 Jun	23h 55m	1 stop	No info
2667	IndiGo	27/03/2019	Kolkata	Banglore	CCU ? BLR	14:20	16:55	2h 35m	non-stop	No info
2668	Jet Airways	6/03/2019	Delhi	Cochin	DEL?BOM?COK	21:50	04:25 07 Mar	6h 35m	1 stop	No info
2669	Air India	6/03/2019	Delhi	Cochin	DEL?BOM?COK	04:00	19:15	15h 15m	1 stop	No info
2670	Multiple carriers	15/06/2019	Delhi	Cochin	DEL?BOM?COK	04:55	19:15	14h 20m	1 stop	No info

2671 rows × 10 columns

# **Data Collection and Preprocessing**

In [5]: testdf.head()

Out[5]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info
0	Jet Airways	6/06/2019	Delhi	Cochin	DEL?BOM?COK	17:30	04:25 07 Jun	10h 55m	1 stop	No info
1	IndiGo	12/05/2019	Kolkata	Banglore	CCU ? MAA ? BLR	06:20	10:20	4h	1 stop	No info
2	Jet Airways	21/05/2019	Delhi	Cochin	DEL?BOM?COK	19:15	19:00 22 May	23h 45m	1 stop	In-flight meal not included
3	Multiple carriers	21/05/2019	Delhi	Cochin	DEL?BOM?COK	08:00	21:00	13h	1 stop	No info
4	Air Asia	24/06/2019	Randlore	Delhi	BLR 2 DEL	23.55	02:45 25 Jun	2h 50m	non-ston	No info

```
In [6]: traindf.head()
 Out[6]:
                  Airline Date_of_Journey
                                          Source Destination
                                                                                     Dep_Time
                                                                                               Arrival_Time
                                                                                                           Duration Total_Stops Additional_Info
                                                                                                                                                Price
                                                                                                                                                 3897
           0
                  IndiGo
                               24/03/2019
                                          Banglore
                                                    New Delhi
                                                                          BLR? DEL
                                                                                         22:20
                                                                                               01:10 22 Mar
                                                                                                             2h 50m
                                                                                                                        non-stop
                                                                                                                                        No info
                 Air India
                                1/05/2019
                                           Kolkata
                                                     Banglore
                                                                CCU ? IXR ? BBI ? BLR
                                                                                         05:50
                                                                                                      13:15
                                                                                                             7h 25m
                                                                                                                         2 stops
                                                                                                                                        No info
                                                                                                                                                 7662
            2
              Jet Airways
                                9/06/2019
                                             Delhi
                                                              DEL ? LKO ? BOM ? COK
                                                                                         09:25
                                                                                                04:25 10 Jun
                                                                                                                19h
                                                                                                                         2 stops
                                                                                                                                        No info
                                                                                                                                                13882
                                                       Cochin
            3
                  IndiGo
                               12/05/2019
                                           Kolkata
                                                                    CCU? NAG? BLR
                                                                                         18:05
                                                                                                      23:30
                                                                                                             5h 25m
                                                                                                                                                 6218
                                                     Banglore
                                                                                                                          1 stop
                                                                                                                                        No info
                               01/03/2019 Banglore
                                                                    BLR ? NAG ? DEL
                                                                                                      21:35
                  IndiGo
                                                    New Delhi
                                                                                         16:50
                                                                                                             4h 45m
                                                                                                                          1 stop
                                                                                                                                        No info
                                                                                                                                               13302
 In [7]: testdf.tail()
 Out[7]:
                         Airline Date_of_Journey Source Destination
                                                                              Route
                                                                                     Dep_Time Arrival_Time Duration Total_Stops Additional_Info
            2666
                       Air India
                                      6/06/2019
                                                Kolkata
                                                           Banglore
                                                                    CCU? DEL? BLR
                                                                                         20:30
                                                                                                20:25 07 Jun
                                                                                                            23h 55m
                                                                                                                                        No info
            2667
                         IndiGo
                                      27/03/2019
                                                Kolkata
                                                           Banglore
                                                                          CCU?BLR
                                                                                         14:20
                                                                                                      16:55
                                                                                                             2h 35m
                                                                                                                        non-stop
                                                                                                                                        No info
            2668
                                      6/03/2019
                                                  Delhi
                                                            Cochin DEL ? BOM ? COK
                                                                                         21:50
                                                                                               04:25 07 Mar
                                                                                                             6h 35m
                                                                                                                                        No info
                     Jet Airways
                                                                                                                          1 stop
            2669
                        Air India
                                      6/03/2019
                                                  Delhi
                                                            Cochin DEL ? BOM ? COK
                                                                                         04:00
                                                                                                      19:15
                                                                                                            15h 15m
                                                                                                                          1 stop
                                                                                                                                        No info
                                      15/06/2019
                                                            Cochin DEL ? BOM ? COK
                                                                                         04:55
                                                                                                      19:15 14h 20m
                                                                                                                                        No info
            2670 Multiple carriers
                                                  Delhi
                                                                                                                          1 stop
 In [8]: traindf.tail()
 Out[8]:
                      Airline Date_of_Journey
                                               Source Destination
                                                                                  Route \ \ Dep\_Time \ \ Arrival\_Time \ \ Duration \ \ Total\_Stops \ \ Additional\_Info
                                                                                                                                                    Price
            10678
                                    9/04/2019
                                                                             CCU?BLR
                                                                                             19:55
                                                                                                         22:25
                                                                                                                                                    4107
                     Air Asia
                                               Kolkata
                                                                                                                 2h 30m
                                                                                                                                            No info
                                                         Banglore
                                                                                                                            non-stop
            10679
                     Air India
                                   27/04/2019
                                               Kolkata
                                                         Banglore
                                                                             CCU?BLR
                                                                                             20:45
                                                                                                         23:20
                                                                                                                 2h 35m
                                                                                                                                            No info
                                                                                                                                                    4145
                                                                                                                            non-stop
            10680
                   Jet Airways
                                   27/04/2019 Banglore
                                                            Delhi
                                                                              BLR? DEL
                                                                                             08:20
                                                                                                          11:20
                                                                                                                     3h
                                                                                                                            non-stop
                                                                                                                                            No info
                                                                                                                                                    7229
            10681
                                                                              BLR? DEL
                      Vistara
                                   01/03/2019 Banglore
                                                        New Delhi
                                                                                             11:30
                                                                                                         14:10
                                                                                                                 2h 40m
                                                                                                                                            No info 12648
                                                                                                                            non-stop
            10682
                     Air India
                                    9/05/2019
                                                           Cochin DEL ? GOI ? BOM ? COK
                                                                                             10:55
                                                                                                          19:15
                                                                                                                 8h 20m
                                                                                                                             2 stops
                                                                                                                                            No info 11753
 In [9]: testdf.shape
 Out[9]: (2671, 10)
In [10]: traindf.shape
Out[10]: (10683, 11)
In [11]: testdf.describe()
Out[11]:
                                                                                  Dep_Time Arrival_Time Duration Total_Stops Additional_Info
                       Airline Date of Journey Source Destination
                                                                            Route
                                                 2671
                                                                             2671
                                                                                                                         2671
                                                                                                                                        2671
                         2671
                                         2671
                                                            2671
                                                                                       2671
                                                                                                    2671
                                                                                                             2671
             count
            unique
                          11
                                           44
                                                    5
                                                               6
                                                                              100
                                                                                         199
                                                                                                     704
                                                                                                              320
                                                                                                                            5
                                                                                                                                           6
              top
                   Jet Airways
                                     9/05/2019
                                                Delhi
                                                           Cochin DEL? BOM? COK
                                                                                       10:00
                                                                                                    19:00
                                                                                                           2h 50m
                                                                                                                         1 stop
                                                                                                                                      No info
                                                            1145
                                                                              624
                                                                                          62
                                                                                                      113
                                                                                                               122
                                                                                                                         1431
                                                                                                                                        2148
                         897
                                          144
                                                 1145
              freq
In [12]: traindf.describe()
Out[12]:
                         Price
                  10683.000000
            count
                   9087.064121
                   4611.359167
              std
                   1759.000000
             25%
                   5277.000000
             50%
                   8372.000000
             75%
                   12373.000000
             max 79512.000000
In [13]: testdf.columns
'Additional_Info'],
                  dtype='object')
In [14]: traindf.columns
'Additional_Info', 'Price'],
                  dtype='object')
```

```
In [15]: traindf.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 10683 entries, 0 to 10682
         Data columns (total 11 columns):
             Column
                              Non-Null Count Dtype
         0
             Airline
                              10683 non-null object
             Date_of_Journey 10683 non-null object
                              10683 non-null object
             Source
             Destination
                              10683 non-null object
                              10682 non-null
             Route
                                             object
             Dep Time
                              10683 non-null
                                             obiect
             Arrival_Time
                              10683 non-null
                                             object
             Duration
                              10683 non-null
                                             object
             Total Stops
                              10682 non-null
          8
                                             object
             Additional_Info 10683 non-null
                                             object
         10 Price
                              10683 non-null int64
         dtypes: int64(1), object(10)
         memory usage: 918.2+ KB
In [16]: testdf.info()
         <class 'pandas.core.frame.DataFrame'>
         RangeIndex: 2671 entries, 0 to 2670
         Data columns (total 10 columns):
                             Non-Null Count Dtype
             Column
         0
                              2671 non-null
             Airline
                                             object
             Date_of_Journey 2671 non-null
                                             object
          1
                              2671 non-null
                                             object
             Source
                              2671 non-null
             Destination
                                             object
                              2671 non-null
             Route
                                              object
             Dep Time
                              2671 non-null
                                             object
             Arrival_Time
                              2671 non-null
                                              object
             Duration
                              2671 non-null
                                              object
             Total Stops
                              2671 non-null
                                              object
          9 Additional_Info 2671 non-null
                                             object
         dtypes: object(10)
         memory usage: 208.8+ KB
```

## **Checking Whether There Are Any Null Values In The Dataset**

```
In [17]: traindf.isnull().sum()
Out[17]: Airline
         Date_of_Journey
                            0
         Source
         Destination
         Route
         Dep Time
         Arrival_Time
         Duration
                            0
         Total Stops
                            1
         Additional_Info
                            0
         Price
         dtype: int64
In [18]: testdf.isnull().sum()
Out[18]: Airline
         Date_of_Journey
         Source
         Destination
         Route
         Dep_Time
         Arrival_Time
                            0
         Duration
                            0
         Total Stops
                            0
         Additional_Info
         dtype: int64
```

### **Removing Null Values From The Dataset**

```
In [20]: traindf.dropna(inplace=True)
In [21]: testdf.dropna(inplace=True)
```

## **Conversion Of Datatype Of Values From String To Numerical Values**

```
In [22]: traindf['Airline'].value_counts()
Out[22]: Airline
         Jet Airways
                                             3849
         IndiGo
                                            2053
         Air India
                                             1751
         Multiple carriers
                                            1196
                                             818
         SpiceJet
         Vistara
         Air Asia
                                             319
         GoAir
                                             194
         Multiple carriers Premium economy
                                              13
         Jet Airways Business
                                               6
         Vistara Premium economy
                                               3
         Trujet
                                               1
         Name: count, dtype: int64
In [23]: traindf['Source'].value_counts()
Out[23]: Source
         Delhi
                    4536
         Kolkata
                    2871
         Banglore
                    2197
         Mumbai
                     697
         Chennai
                     381
         Name: count, dtype: int64
In [24]: traindf['Destination'].value_counts()
Out[24]: Destination
         Cochin
                     4536
         Banglore
                      2871
         Delhi
                     1265
         New Delhi
                      932
         Hyderabad
                      697
         Kolkata
                      381
         Name: count, dtype: int64
In [25]: traindf['Total_Stops'].value_counts()
Out[25]: Total_Stops
                    5625
         1 stop
         non-stop
                    3491
         2 stops
                    1520
         3 stops
                      45
         4 stops
                       1
         Name: count, dtype: int64
"Multiple carriers Premium economy":8,
"Jet Airways Business":9,"Vistara Premium economy":10,"Trujet":11}}
         traindf=traindf.replace(flight)
         traindf
Out[26]:
```

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Price
0	1	24/03/2019	Banglore	New Delhi	BLR ? DEL	22:20	01:10 22 Mar	2h 50m	non-stop	No info	3897
1	2	1/05/2019	Kolkata	Banglore	CCU ? IXR ? BBI ? BLR	05:50	13:15	7h 25m	2 stops	No info	7662
2	0	9/06/2019	Delhi	Cochin	DEL ? LKO ? BOM ? COK	09:25	04:25 10 Jun	19h	2 stops	No info	13882
3	1	12/05/2019	Kolkata	Banglore	CCU ? NAG ? BLR	18:05	23:30	5h 25m	1 stop	No info	6218
4	1	01/03/2019	Banglore	New Delhi	BLR ? NAG ? DEL	16:50	21:35	4h 45m	1 stop	No info	13302
10678	6	9/04/2019	Kolkata	Banglore	CCU?BLR	19:55	22:25	2h 30m	non-stop	No info	4107
10679	2	27/04/2019	Kolkata	Banglore	CCU?BLR	20:45	23:20	2h 35m	non-stop	No info	4145
10680	0	27/04/2019	Banglore	Delhi	BLR ? DEL	08:20	11:20	3h	non-stop	No info	7229
10681	5	01/03/2019	Banglore	New Delhi	BLR ? DEL	11:30	14:10	2h 40m	non-stop	No info	12648
10682	2	9/05/2019	Delhi	Cochin	DEL ? GOI ? BOM ? COK	10:55	19:15	8h 20m	2 stops	No info	11753

10682 rows × 11 columns

Out[27]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Price
0	1	24/03/2019	2	New Delhi	BLR ? DEL	22:20	01:10 22 Mar	2h 50m	non-stop	No info	3897
1	2	1/05/2019	1	Banglore	CCU ? IXR ? BBI ? BLR	05:50	13:15	7h 25m	2 stops	No info	7662
2	0	9/06/2019	0	Cochin	DEL ? LKO ? BOM ? COK	09:25	04:25 10 Jun	19h	2 stops	No info	13882
3	1	12/05/2019	1	Banglore	CCU ? NAG ? BLR	18:05	23:30	5h 25m	1 stop	No info	6218
4	1	01/03/2019	2	New Delhi	BLR ? NAG ? DEL	16:50	21:35	4h 45m	1 stop	No info	13302
10678	6	9/04/2019	1	Banglore	CCU?BLR	19:55	22:25	2h 30m	non-stop	No info	4107
10679	2	27/04/2019	1	Banglore	CCU?BLR	20:45	23:20	2h 35m	non-stop	No info	4145
10680	0	27/04/2019	2	Delhi	BLR ? DEL	08:20	11:20	3h	non-stop	No info	7229
10681	5	01/03/2019	2	New Delhi	BLR ? DEL	11:30	14:10	2h 40m	non-stop	No info	12648
10682	2	9/05/2019	0	Cochin	DEL ? GOI ? BOM ? COK	10:55	19:15	8h 20m	2 stops	No info	11753

10682 rows × 11 columns

Out[28]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Price
0	1	24/03/2019	2	3	BLR ? DEL	22:20	01:10 22 Mar	2h 50m	non-stop	No info	3897
1	2	1/05/2019	1	1	CCU ? IXR ? BBI ? BLR	05:50	13:15	7h 25m	2 stops	No info	7662
2	0	9/06/2019	0	0	DEL ? LKO ? BOM ? COK	09:25	04:25 10 Jun	19h	2 stops	No info	13882
3	1	12/05/2019	1	1	CCU ? NAG ? BLR	18:05	23:30	5h 25m	1 stop	No info	6218
4	1	01/03/2019	2	3	BLR ? NAG ? DEL	16:50	21:35	4h 45m	1 stop	No info	13302
10678	6	9/04/2019	1	1	CCU?BLR	19:55	22:25	2h 30m	non-stop	No info	4107
10679	2	27/04/2019	1	1	CCU?BLR	20:45	23:20	2h 35m	non-stop	No info	4145
10680	0	27/04/2019	2	2	BLR ? DEL	08:20	11:20	3h	non-stop	No info	7229
10681	5	01/03/2019	2	3	BLR ? DEL	11:30	14:10	2h 40m	non-stop	No info	12648
10682	2	9/05/2019	0	0	DEL ? GOI ? BOM ? COK	10:55	19:15	8h 20m	2 stops	No info	11753

10682 rows × 11 columns

Out[29]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Price
0	1	24/03/2019	2	3	BLR ? DEL	22:20	01:10 22 Mar	2h 50m	0	No info	3897
1	2	1/05/2019	1	1	CCU ? IXR ? BBI ? BLR	05:50	13:15	7h 25m	2	No info	7662
2	0	9/06/2019	0	0	DEL ? LKO ? BOM ? COK	09:25	04:25 10 Jun	19h	2	No info	13882
3	1	12/05/2019	1	1	CCU ? NAG ? BLR	18:05	23:30	5h 25m	1	No info	6218
4	1	01/03/2019	2	3	BLR ? NAG ? DEL	16:50	21:35	4h 45m	1	No info	13302
10678	6	9/04/2019	1	1	CCU ? BLR	19:55	22:25	2h 30m	0	No info	4107
10679	2	27/04/2019	1	1	CCU ? BLR	20:45	23:20	2h 35m	0	No info	4145
10680	0	27/04/2019	2	2	BLR ? DEL	08:20	11:20	3h	0	No info	7229
10681	5	01/03/2019	2	3	BLR ? DEL	11:30	14:10	2h 40m	0	No info	12648
10682	2	9/05/2019	0	0	DEL ? GOI ? BOM ? COK	10:55	19:15	8h 20m	2	No info	11753

10682 rows × 11 columns

## **Data Visualization**



Out[30]: <Axes: >

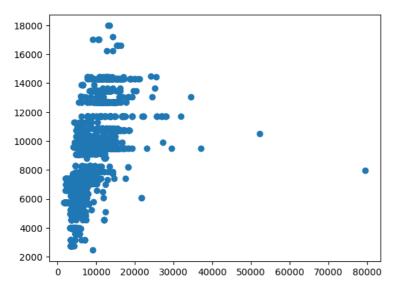


## Feature Scaling: To Split the data into training data and test data

```
In [31]: x=fdf[['Airline','Source','Destination','Total_Stops']]
y=fdf['Price']
In [32]: from sklearn.model_selection import train_test_split
          X_train,X_test,y_train,y_test=train_test_split(x,y,test_size=0.3,random_state=100)
```

```
Linear Regression
In [33]: from sklearn.linear_model import LinearRegression
         regr=LinearRegression()
         regr.fit(X_train,y_train)
         print(regr.intercept_)
         coeff_df=pd.DataFrame(regr.coef_,x.columns,columns=['coefficient'])
         7211.098088897488
Out[33]:
                       coefficient
              Airline
                      -418.483922
              Source -3275.073380
          Destination 2505.480291
          Total_Stops 3541.798053
In [34]: score=regr.score(X_test,y_test)
         print(score)
         0.4108304890928348
In [35]: predictions=regr.predict(X_test)
```

Out[36]: <matplotlib.collections.PathCollection at 0x54b664a2d0>



```
In [37]: x=np.array(fdf['Price']).reshape(-1,1)
y=np.array(fdf['Total_Stops']).reshape(-1,1)
fdf.dropna(inplace=True)
```

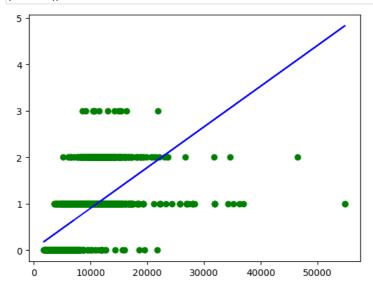
C:\Users\anu\AppData\Local\Temp\ipykernel\_4272\521034954.py:3: SettingWithCopyWarning: A value is trying to be set on a copy of a slice from a DataFrame

See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user\_guide/indexing.html#returning-a-view-versus-a-copy) fdf.dropna(inplace=True)

```
In [38]: X_train,X_test,y_train,y_test=train_test_split(x,y,test_size=0.3)
    regr.fit(X_train,y_train)
    regr.fit(X_train,y_train)
```

Out[38]: v LinearRegression LinearRegression()

```
In [39]: y_pred=regr.predict(X_test)
    plt.scatter(X_test,y_test,color='g')
    plt.plot(X_test,y_pred,color='b')
    plt.show()
```



### LOGISTIC REGRESSION

```
In [41]: #Logistic Regression
                     x=np.array(fdf['Price']).reshape(-1,1)
                     y=np.array(fdf['Total_Stops']).reshape(-1,1)
                     fdf.dropna(inplace=True)
                     x_train,x_test,y_train,y_test=train_test_split(x,y,test_size=0.3,random_state=1)
                     from sklearn.linear_model import LogisticRegression
                     lr=LogisticRegression(max_iter=10000)
                     C:\Users\anu\AppData\Local\Temp\ipykernel_4272\325765256.py:4: SettingWithCopyWarning:
                     A value is trying to be set on a copy of a slice from a DataFrame
                     See the caveats in the documentation: https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-v
                     ersus-a-copy (https://pandas.pydata.org/pandas-docs/stable/user_guide/indexing.html#returning-a-view-versus-a-copy)
                         fdf.dropna(inplace=True)
In [42]: lr.fit(x_train,y_train)
                      C:\Users\anu\AppData\Local\Programs\Python\Python311\Lib\site-packages\sklearn\utils\validation.py: 1143:\ DataConversion\Warnin AppData\Local\Programs\Python\Python311\Lib\site-packages\Nutries\Python\University Python\Python311\Lib\site-packages\Nutries\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Python\Py
                     g: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples, ), for example using
                     ravel().
                         y = column_or_1d(y, warn=True)
Out[42]: 🔻
                                         LogisticRegression
                      LogisticRegression(max_iter=10000)
In [43]: score=lr.score(x_test,y_test)
                    print(score)
                     0.7160686427457098
In [44]: sns.regplot(x=x,y=y,data=fdf,logistic=True,ci=None)
                     g: overflow encountered in exp
                         t = np.exp(-z)
Out[44]: <Axes: >
                        4.0
                        3.5
                        3.0
                        2.5
                        2.0
                        1.5
                        1.0
                        0.5
```

#### **DECISION TREE**

0.0

10000 20000 30000 40000 50000 60000 70000 80000

#### RANDOM FOREST

0.9369734789391576

```
In [47]: #Random forest classifier
               from sklearn.ensemble import RandomForestClassifier
               rfc=RandomForestClassifier()
               rfc.fit(X_train,y_train)
               C:\Users\anu\AppData\Local\Temp\ipykernel_4272\1232785509.py:4: DataConversionWarning: A column-vector y was passed when a 1d
               array was expected. Please change the shape of y to (n_samples,), for example using ravel().
                  rfc.fit(X_train,y_train)
Out[47]: RandomForestClassifier
                RandomForestClassifier()
In [48]: params={'max_depth':[2,3,5,10,20],'min_samples_leaf':[5,10,20,50,100,200],'n_estimators':[10,25,30,50,100,200]}
In [49]: from sklearn.model_selection import GridSearchCV
               grid_search=GridSearchCV(estimator=rfc,param_grid=params,cv=2,scoring="accuracy")
In [50]: grid search.fit(X train.v train)
               he least populated class in y has only 1 members, which is less than n_splits=2.
                  warnings.warn(
                \verb| C:\Users\anu\AppData\Local\Programs\Python\Python311\Lib\site-packages\sklearn\model\_selection\_validation.py:686: DataConversion of the particle of the
               rsionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for e
               xample using ravel().
                  estimator.fit(X_train, y_train, **fit_params)
               C:\Users\anu\AppData\Local\Programs\Python\Python311\Lib\site-packages\sklearn\model_selection\_validation.py:686: DataConve
               rsionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for e
               xample using ravel().
                  estimator.fit(X_train, y_train, **fit_params)
               C:\Users\anu\AppData\Local\Programs\Python\Python311\Lib\site-packages\sklearn\model_selection\_validation.py:686: DataConve
               rsionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for e
               xample using ravel().
                  estimator.fit(X_train, y_train, **fit_params)
               {\tt C:\backslash Users\anu\AppData\Local\Programs\Python\Python311\Lib\site-packages\sklearn\model\_selection\vertex}. }
               rsionWarning: A column-vector y was passed when a 1d array was expected. Please change the shape of y to (n_samples,), for e
               xample using ravel().
                  estimator.fit(X_train, y_train, **fit_params)
In [51]: grid_search.best_score_
Out[51]: 0.523605715699528
In [52]: rf_best=grid_search.best_estimator_
               rf_best
Out[52]:
                                                         RandomForestClassifier
                RandomForestClassifier(max_depth=2, min_samples_leaf=5, n_estimators=10)
In [53]: from sklearn.tree import plot tree
               plt.figure(figsize=(80,40))
               plot_tree(rf_best.estimators_[4],class_names=['0','1','2','3','4'],filled=True);
                                                                                                          x[0] \le 2060.5
                                                                                                            gini = 0.596
                                                                                                         samples = 4700
                                                                                            value = [2448, 3937, 1054, 36, 2]
                                                                                                              class = 1
                                                       x[0] \le 2033.5
                                                                                                                                                           x[0] \le 27711.0
                                                         gini = 0.571
                                                                                                                                                               gini = 0.595
                                                        samples = 33
                                                                                                                                                            samples = 4667
                                                                                                                                               value = [2441, 3909, 1040, 36, 2]
                                                 value = [7, 28, 14, 0, 0]
class = 1
                                                                                                                                                                class = 1
                                qini = 0.602
                                                                                  qini = 0.245
                                                                                                                                     aini = 0.596
                                                                                                                                                                                        qini = 0.304
                               samples = 28
                                                                                  samples = 5
                                                                                                                                   samples = 4657
                                                                                                                                                                                       samples = 10
                                                                             value = [0, 6, 1, 0, 0]
                                                                                                                                                                                 value = [2, 14, 1, 0, 0]
                        value = [7, 22, 13, 0, 0]
                                                                                                                      value = [2439, 3895, 1039, 36, 2]
                                                                                     class = 1
                                                                                                                                                                                          class = 1
                                  class = 1
                                                                                                                                       class = 1
In [54]: score=rfc.score(x_test,y_test)
               print(score)
               0.46926677067082684
```

# **CONCLUSION:**

Based on accuracy decision tree is best fit for the given data set

In [ ]: