

## Importing Required Library

```
In [1]: import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
import seaborn as sns
import pickle
import datetime
pd.set_option('Display.max_columns', None)
from sklearn.preprocessing import StandardScaler, LabelEncoder
from sklearn.model_selection import train_test_split
%matplotlib inline

import warnings
warnings.filterwarnings('ignore')
```

## Reading Data

```
In [2]: df = pd.read_excel(r"C:\Users\Kushal Arya\Desktop\csv file\Flight_Ticket_Participant.xlsx")
df.head()
```

Out[2]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total
0	Jet Airways	6/06/2019	Delhi	Cochin	DEL → BOM → COK	17:30	04:25 07 Jun	10h 55m	
1	IndiGo	12/05/2019	Kolkata	Banglore	CCU → MAA → BLR	06:20	10:20	4h	
2	Jet Airways	21/05/2019	Delhi	Cochin	DEL → BOM → COK	19:15	19:00 22 May	23h 45m	
3	Multiple carriers	21/05/2019	Delhi	Cochin	DEL → BOM → COK	08:00	21:00	13h	
4	Air Asia	24/06/2019	Banglore	Delhi	BLR → DEL	23:55	02:45 25 Jun	2h 50m	n

## Check no of row and column

```
In [3]: print('No of Rows and Columns ----->', df.shape )
```

```
No of Rows and Columns -----> (2671, 10)
```

## Checking for Null values

```
In [4]: print('=====\\n')
print(df.isnull().sum())
print('=====')
```

```
=====
```

```
Airline      0
Date_of_Journey 0
Source      0
Destination   0
Route        0
Dep_Time     0
Arrival_Time 0
Duration     0
Total_Stops   0
Additional_Info 0
dtype: int64
```

```
=====
```

**There is no null value**

## Information about dataset

```
In [5]: print('=====\\n')
print(df.info())
print('=====')
```

```
=====
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 2671 entries, 0 to 2670
Data columns (total 10 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2671 non-null    object  
 1   Date_of_Journey  2671 non-null    object  
 2   Source           2671 non-null    object  
 3   Destination      2671 non-null    object  
 4   Route            2671 non-null    object  
 5   Dep_Time         2671 non-null    object  
 6   Arrival_Time     2671 non-null    object  
 7   Duration         2671 non-null    object  
 8   Total_Stops      2671 non-null    object  
 9   Additional_Info   2671 non-null    object  
dtypes: object(10)
memory usage: 208.8+ KB
None
=====
```

**Categorical data present in our data set**

## **Checking For Duplicate**

```
In [6]: duplicate = df[df.duplicated()]
```

```
=====
print("Duplicate Rows :\n\n",duplicate)
=====
```

```
=====
Duplicate Rows :
```

	Airline	Date_of_Journey	Source	Destination	\
294	Jet Airways	12/06/2019	Delhi	Cochin	
794	Jet Airways	12/06/2019	Delhi	Cochin	
909	IndiGo	24/03/2019	Banglore	New Delhi	
974	Air India	12/06/2019	Kolkata	Banglore	
1011	Jet Airways	9/05/2019	Delhi	Cochin	
1033	Multiple carriers	15/05/2019	Delhi	Cochin	
1044	GoAir	24/03/2019	Banglore	New Delhi	
1233	Jet Airways	6/06/2019	Delhi	Cochin	
1504	Air India	15/06/2019	Delhi	Cochin	
1537	Jet Airways	6/06/2019	Delhi	Cochin	
1752	Multiple carriers	21/05/2019	Delhi	Cochin	
1753	Jet Airways	18/05/2019	Delhi	Cochin	
1783	Air India	12/03/2019	Banglore	New Delhi	
1876	Air India	1/04/2019	Kolkata	Banglore	
1962	Multiple carriers	15/06/2019	Delhi	Cochin	
2007	Jet Airways	24/06/2019	Delhi	Cochin	
2042	Air India	09/03/2019	Banglore	New Delhi	
2083	Air India	15/06/2019	Delhi	Cochin	
2095	Jet Airways	1/06/2019	Delhi	Cochin	
2171	Jet Airways	21/05/2019	Delhi	Cochin	
2310	Jet Airways	27/03/2019	Delhi	Cochin	
2536	Air India	3/06/2019	Delhi	Cochin	
2553	Jet Airways	15/06/2019	Delhi	Cochin	
2560	Multiple carriers	3/06/2019	Delhi	Cochin	
2582	Air India	12/05/2019	Kolkata	Banglore	
2583	IndiGo	24/03/2019	Banglore	New Delhi	

	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	\
294	DEL → JAI → BOM → COK	05:30	04:25 13 Jun	22h 55m	2 stops	
794	DEL → JAI → BOM → COK	05:30	04:25 13 Jun	22h 55m	2 stops	
909	BLR → DEL	20:00	22:55	2h 55m	non-stop	
974	CCU → DEL → AMD → BLR	07:00	05:25 13 Jun	22h 25m	2 stops	
1011	DEL → JAI → BOM → COK	05:30	04:25 10 May	22h 55m	2 stops	
1033	DEL → BOM → COK	07:30	19:15	11h 45m	1 stop	
1044	BLR → DEL	20:55	23:50	2h 55m	non-stop	
1233	DEL → JAI → BOM → COK	05:30	04:25 07 Jun	22h 55m	2 stops	
1504	DEL → GOI → BOM → COK	22:00	19:15 16 Jun	21h 15m	2 stops	
1537	DEL → NAG → BOM → COK	06:45	04:25 07 Jun	21h 40m	2 stops	
1752	DEL → BOM → COK	07:30	19:15	11h 45m	1 stop	
1753	DEL → AMD → BOM → COK	23:05	19:00 19 May	19h 55m	2 stops	
1783	BLR → CCU → GAU → DEL	05:50	22:10	16h 20m	2 stops	
1876	CCU → DEL → COK → BLR	07:00	01:20 02 Apr	18h 20m	2 stops	
1962	DEL → BOM → COK	10:00	21:00	11h	1 stop	
2007	DEL → JAI → BOM → COK	09:40	04:25 25 Jun	18h 45m	2 stops	
2042	BLR → BOM → AMD → DEL	17:25	23:55 13 Mar	30h 30m	2 stops	
2083	DEL → HYD → BOM → COK	13:15	19:15 16 Jun	30h	2 stops	
2095	DEL → NAG → BOM → COK	14:35	04:25 02 Jun	13h 50m	2 stops	

2171	DEL → JAI → BOM → COK	09:40	12:35	22 May	26h 55m	2 stops
2310	DEL → MAA → BOM → COK	05:10	04:25	28 Mar	23h 15m	2 stops
2536	DEL → GOI → BOM → COK	22:00	19:15	04 Jun	21h 15m	2 stops
2553	DEL → JAI → BOM → COK	05:30		19:00	13h 30m	2 stops
2560	DEL → BOM → COK	13:00	01:30	04 Jun	12h 30m	1 stop
2582	CCU → BOM → GOI → BLR	16:50	05:35	13 May	12h 45m	2 stops
2583	BLR → DEL	18:55		21:45	2h 50m	non-stop

#### Additional\_Info

294	No info
794	In-flight meal not included
909	No info
974	No info
1011	No info
1033	No info
1044	No info
1233	No info
1504	No info
1537	In-flight meal not included
1752	No info
1753	No info
1783	No info
1876	No info
1962	No info
2007	No info
2042	No info
2083	No info
2095	In-flight meal not included
2171	No info
2310	In-flight meal not included
2536	No info
2553	No info
2560	No info
2582	No info
2583	No info

---

## Droping Duplicates

In [7]: `df.drop_duplicates(keep=False,inplace=True)`

In [8]: `print('After removing duplicates No of Rows and Columns ---->', df.shape )`

After removing duplicates No of Rows and Columns ----> (2619, 10)

## Add Months Column

```
In [9]: df['Date_of_Journey'] = pd.to_datetime(df['Date_of_Journey'])
df['Months'] = df['Date_of_Journey'].dt.month
df['Months'] = df['Months'].astype('int')
df.head(2)
```

Out[9]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Duration
0	Jet Airways	2019-06-06	Delhi	Cochin	DEL → BOM → COK	17:30	04:25 07 Jun	10h 55m	
1	IndiGo	2019-12-05	Kolkata	Banglore	CCU → MAA → BLR	06:20	10:20	4h	

```
In [10]: df['Months'].value_counts()
```

```
Out[10]: 6    636
3    533
5    481
9    359
1    270
12   247
4    93
Name: Months, dtype: int64
```

```
In [11]: df['Months'].dtype
```

```
Out[11]: dtype('int32')
```

## Add Day Column

```
In [12]: df['Day'] = df['Date_of_Journey'].dt.day
df['Day'] = df['Day'].astype('int')
df.head(2)
```

Out[12]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Duration
0	Jet Airways	2019-06-06	Delhi	Cochin	DEL → BOM → COK	17:30	04:25 07 Jun	10h 55m	
1	IndiGo	2019-12-05	Kolkata	Banglore	CCU → MAA → BLR	06:20	10:20	4h	

```
In [13]: df['Day'].value_counts()
```

```
Out[13]: 6      545  
3      374  
5      370  
15     257  
21     253  
24     247  
27     218  
18     202  
4      153  
Name: Day, dtype: int64
```

```
In [14]: df['Day'].dtype
```

```
Out[14]: dtype('int32')
```

## Add New Arrival Column

```
In [15]: df['Arrival_Time'] = pd.to_datetime(df['Arrival_Time'])  
df['NewArrival_Time'] = df['Arrival_Time'].dt.time  
df.head(2)
```

```
Out[15]:
```

Flight	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	More
6-06	Delhi	Cochin	DEL → BOM → COK	17:30	2021-06-07 04:25:00	10h 55m	1 stop	No info	
2-05	Kolkata	Banglore	CCU → MAA → BLR	06:20	2021-08-10 10:20:00	4h	1 stop	No info	

## Add New Departure Time column

```
In [16]: df['Dep_Time'] = pd.to_datetime(df['Dep_Time'])
df['NewDep_Time'] = df['Dep_Time'].dt.time
df.head(2)
```

Out[16]:

	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops	Additional_Info	Months	Day	NewArrival_Time	NewDep_Time
	Cochin	DEL → BOM → COK	2021-08-10 17:30:00	2021-06-07 04:25:00	10h 55m	1 stop	No info	6	6		
	Banglore	CCU → MAA → BLR	2021-08-10 06:20:00	2021-08-10 10:20:00	4h	1 stop	No info	12	5		

```
In [17]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2619 entries, 0 to 2670
Data columns (total 14 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2619 non-null    object  
 1   Date_of_Journey  2619 non-null    datetime64[ns]
 2   Source           2619 non-null    object  
 3   Destination      2619 non-null    object  
 4   Route            2619 non-null    object  
 5   Dep_Time         2619 non-null    datetime64[ns]
 6   Arrival_Time     2619 non-null    datetime64[ns]
 7   Duration         2619 non-null    object  
 8   Total_Stops      2619 non-null    object  
 9   Additional_Info   2619 non-null    object  
 10  Months           2619 non-null    int32  
 11  Day              2619 non-null    int32  
 12  NewArrival_Time  2619 non-null    object  
 13  NewDep_Time      2619 non-null    object  
dtypes: datetime64[ns](3), int32(2), object(9)
memory usage: 286.5+ KB
```

## Converting New Arrival Time and New Departure Time column in Minutes

```
In [18]: df['Dep_Hours'] = df['Dep_Time'].apply(lambda x: x.hour * 3600 + x.minute * 60 + x.second)
df['Arrival_Hours'] = df['NewArrival_Time'].apply(lambda x: x.hour * 3600 + x.minute * 60 + x.second)
df.head(2)
```

Out[18]:

Index	Arrival_Time	Duration	Total_Stops	Additional_Info	Months	Day	NewArrival_Time	NewDep_Hours
8-10-00	2021-06-07 04:25:00	10h 55m	1 stop	No info	6	6	04:25:00	17:30
8-10-00	2021-08-10 10:20:00	4h	1 stop	No info	12	5	10:20:00	06:20

## Split Duration column into Hours and Minutes

```
In [19]: new = df['Duration'].str.split(' ', n = 2, expand = True)
df['Hours'] = new[0]
df['Minutes'] = new[1]
df.head(2)
```

Out[19]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops
0	Jet Airways	2019-06-06	Delhi	Cochin	DEL → BOM → COK	2021-08-10 17:30:00	2021-06-07 04:25:00	10h 55m	1
1	IndiGo	2019-12-05	Kolkata	Bangalore	CCU → MAA → BLR	2021-08-10 06:20:00	2021-08-10 10:20:00	4h	1

```
In [20]: df['Hours'] = new[0].str.split('h', expand = True)
df['Minutes'] = new[1].str.split('m', expand = True)
df.head(2)
```

Out[20]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Stops
0	Jet Airways	2019-06-06	Delhi	Cochin	DEL → BOM → COK	2021-08-10 17:30:00	2021-06-07 04:25:00	10h 55m	
1	IndiGo	2019-12-05	Kolkata	Banglore	CCU → MAA → BLR	2021-08-10 06:20:00	2021-08-10 10:20:00	4h	

```
In [21]: df['Hours'] = df['Hours'].replace(['5m'], '5')
df['Hours'] = df['Hours'].astype(np.float)
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2619 entries, 0 to 2670
Data columns (total 18 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2619 non-null    object  
 1   Date_of_Journey  2619 non-null    datetime64[ns]
 2   Source           2619 non-null    object  
 3   Destination      2619 non-null    object  
 4   Route            2619 non-null    object  
 5   Dep_Time         2619 non-null    datetime64[ns]
 6   Arrival_Time     2619 non-null    datetime64[ns]
 7   Duration         2619 non-null    object  
 8   Total_Stops      2619 non-null    object  
 9   Additional_Info  2619 non-null    object  
 10  Months           2619 non-null    int32  
 11  Day              2619 non-null    int32  
 12  NewArrival_Time 2619 non-null    object  
 13  NewDep_Time     2619 non-null    object  
 14  Dep_Hours        2619 non-null    float64 
 15  Arrival_Hours   2619 non-null    float64 
 16  Hours            2619 non-null    float64 
 17  Minutes          2369 non-null    object  
dtypes: datetime64[ns](3), float64(3), int32(2), object(10)
memory usage: 368.3+ KB
```

```
In [22]: df['Minutes'] = df['Minutes'].fillna(df['Minutes'].mode()[0])
df['Minutes'] = df['Minutes'].astype(np.float)
```

```
In [23]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2619 entries, 0 to 2670
Data columns (total 18 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2619 non-null    object  
 1   Date_of_Journey  2619 non-null    datetime64[ns]
 2   Source           2619 non-null    object  
 3   Destination      2619 non-null    object  
 4   Route            2619 non-null    object  
 5   Dep_Time         2619 non-null    datetime64[ns]
 6   Arrival_Time     2619 non-null    datetime64[ns]
 7   Duration         2619 non-null    object  
 8   Total_Stops      2619 non-null    object  
 9   Additional_Info  2619 non-null    object  
 10  Months           2619 non-null    int32  
 11  Day              2619 non-null    int32  
 12  NewArrival_Time 2619 non-null    object  
 13  NewDep_Time     2619 non-null    object  
 14  Dep_Hours        2619 non-null    float64 
 15  Arrival_Hours   2619 non-null    float64 
 16  Hours            2619 non-null    float64 
 17  Minutes          2619 non-null    float64 
dtypes: datetime64[ns](3), float64(4), int32(2), object(9)
memory usage: 368.3+ KB
```

## Adding New Duration column

```
In [24]: df['New_Duration'] = df['Hours']*60 + df['Minutes']
df.head(2)
```

Out[24]:

	Airline	Date_of_Journey	Source	Destination	Route	Dep_Time	Arrival_Time	Duration	Total_Duration
0	Jet Airways	2019-06-06	Delhi	Cochin	DEL → BOM → COK	2021-08-10 17:30:00	2021-06-07 04:25:00	10h 55m	
1	IndiGo	2019-12-05	Kolkata	Banglore	CCU → MAA → BLR	2021-08-10 06:20:00	2021-08-10 10:20:00	4h	

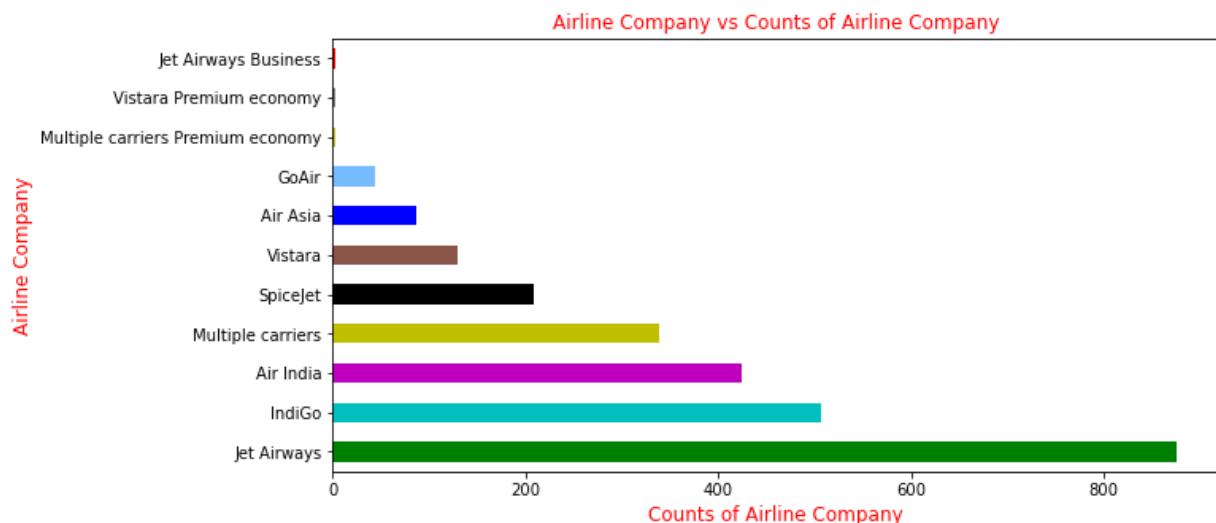
## Analysis of Data

## Analysis of Data

```
In [25]: ar = df['Airline'].value_counts()  
ar
```

```
Out[25]: Jet Airways          875  
IndiGo              507  
Air India            424  
Multiple carriers    339  
SpiceJet             208  
Vistara              129  
Air Asia              86  
GoAir                44  
Multiple carriers Premium economy 3  
Vistara Premium economy 2  
Jet Airways Business 2  
Name: Airline, dtype: int64
```

```
In [26]: ar.plot.barh(figsize = (10,5), color = ['g','c', 'm', 'y','k','tab:brown','b','xkcd:teal'],  
plt.ylabel('Airline Company', c = 'r', fontsize = 12)  
plt.xlabel('Counts of Airline Company', c = 'r', fontsize = 12 )  
plt.title('Airline Company vs Counts of Airline Company', c = 'r', fontsize = 12)  
plt.show()
```



Above plot shows Jet Airways has highest and Jet Airways Business has lowest flight counts

## Delete Unwanted Columns

```
In [28]: col = ['Date_of_Journey', 'Dep_Time', 'Arrival_Time', 'Duration']
```

```
In [29]: df = df.drop(col, axis = 1)
df.head(2)
```

Out[29]:

	Airline	Source	Destination	Route	Total_Stops	Additional_Info	Months	Day	NewArrival_Time
0	Jet Airways	Delhi	Cochin	BOM → COK	1 stop	No info	6	6	04:25:01
1	IndiGo	Kolkata	Banglore	CCU → MAA → BLR	1 stop	No info	12	5	10:20:01

```
In [30]: df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2619 entries, 0 to 2670
Data columns (total 15 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2619 non-null    object  
 1   Source           2619 non-null    object  
 2   Destination      2619 non-null    object  
 3   Route            2619 non-null    object  
 4   Total_Stops      2619 non-null    object  
 5   Additional_Info  2619 non-null    object  
 6   Months           2619 non-null    int32  
 7   Day              2619 non-null    int32  
 8   NewArrival_Time  2619 non-null    object  
 9   NewDep_Time      2619 non-null    object  
 10  Dep_Hours        2619 non-null    float64 
 11  Arrival_Hours   2619 non-null    float64 
 12  Hours            2619 non-null    float64 
 13  Minutes          2619 non-null    float64 
 14  New_Duration     2619 non-null    float64 
dtypes: float64(5), int32(2), object(8)
memory usage: 306.9+ KB
```

## Encoding Categorical columns

```
In [31]: le = LabelEncoder()
```

```
In [32]: df['Airline'] = le.fit_transform(df['Airline'])
df['Source'] = le.fit_transform(df['Source'])
df['Destination'] = le.fit_transform(df['Destination'])
df['Route'] = le.fit_transform(df['Route'])
df['Additional_Info'] = le.fit_transform(df['Additional_Info'])
df['NewArrival_Time'] = le.fit_transform(df['NewArrival_Time'])
df['NewDep_Time'] = le.fit_transform(df['NewDep_Time'])
df['Total_Stops'] = le.fit_transform(df['Total_Stops'])
df.info()
```

```
<class 'pandas.core.frame.DataFrame'>
Int64Index: 2619 entries, 0 to 2670
Data columns (total 15 columns):
 #   Column           Non-Null Count  Dtype  
--- 
 0   Airline          2619 non-null    int32  
 1   Source           2619 non-null    int32  
 2   Destination      2619 non-null    int32  
 3   Route            2619 non-null    int32  
 4   Total_Stops      2619 non-null    int32  
 5   Additional_Info  2619 non-null    int32  
 6   Months           2619 non-null    int32  
 7   Day              2619 non-null    int32  
 8   NewArrival_Time  2619 non-null    int32  
 9   NewDep_Time      2619 non-null    int32  
 10  Dep_Hours        2619 non-null    float64 
 11  Arrival_Hours   2619 non-null    float64 
 12  Hours            2619 non-null    float64 
 13  Minutes          2619 non-null    float64 
 14  New_Duration     2619 non-null    float64 
dtypes: float64(5), int32(10)
memory usage: 225.1 KB
```

**Columns are encoded**

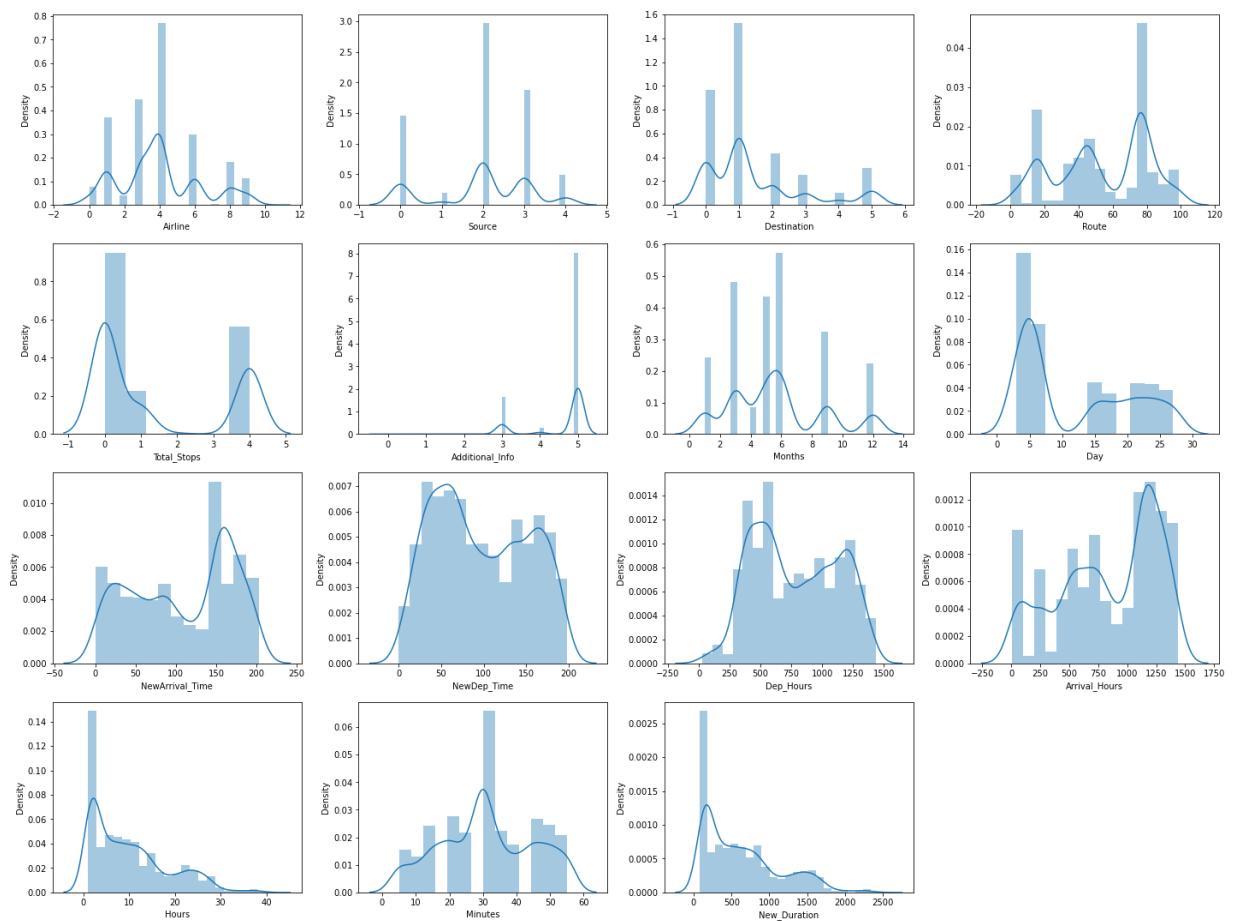
**Data distribution**

```
In [33]: print('-----')
print('Distribution Plot :- ')
print('-----')

plt.figure(figsize = (20,15))
plotnumber = 1

for column in df:
    if plotnumber <=16:
        ax = plt.subplot(4,4, plotnumber)
        sns.distplot(df[column])
        plt.xlabel(column)
    plotnumber +=1
plt.tight_layout()
```

-----  
**Distribution Plot :-**  
-----



**Data distribution is fine**

## Data Scaling

```
In [34]: scaler = StandardScaler()
x_scaled = scaler.fit_transform(df)
x_scaled
```

```
Out[34]: array([[ 0.00547242,  0.02859057, -0.2927839 , ..., -0.00667918,
       1.7152351 ,  0.04117166],
      [-0.42883906,  0.86992434, -0.97620727, ..., -0.72555976,
       -0.07820179, -0.72960444],
      [ 0.00547242,  0.02859057, -0.2927839 , ...,  1.55089542,
       0.99786034,  1.58272386],
      ...,
      [ 0.00547242,  0.02859057, -0.2927839 , ..., -0.4859329 ,
       0.28048559, -0.47935246],
      [-1.29746202,  0.02859057, -0.2927839 , ...,  0.59238798,
       -1.15426393,  0.56169578],
      [ 0.87409539,  0.02859057, -0.2927839 , ...,  0.47257455,
       -0.79557655,  0.45158491]])
```

## Predict Flight Ticket Price

```
In [35]: model = pickle.load(open('Flight Price Prediction Train.pickle', 'rb'))
```

```
In [37]: price = model.predict(df)
price
```

```
Out[37]: array([ 9740.454,  4753.524, 14383.318, ..., 14554.69 , 12073.196,
       8697.85 ], dtype=float32)
```

```
In [38]: pred = pd.DataFrame(price)
pred
```

Out[38]:

	0
0	9740.454102
1	4753.523926
2	14383.318359
3	8538.320312
4	4594.645508
...	...
2614	8654.800781
2615	4403.861328
2616	14554.690430
2617	12073.196289
2618	8697.849609

2619 rows × 1 columns

## Saving Predicted Flight Ticket Price into CSV file

```
In [39]: pred.to_csv('Predicted Flight Ticket Price.csv', index = False)
```

In [ ]: