SpaceX Falcon 9 First Stage Landing Prediction

Assignment: Exploring and Preparing Data

Estimated time needed: 70 minutes

In this assignment, we will predict if the Falcon 9 first stage will land successfully. SpaceX advertises Falcon 9 rocket launches on its website with a cost of 62 million dollars; other providers cost upward of 165 million dollars each, much of the savings is due to the fact that SpaceX can reuse the first stage.

In this lab, you will perform Exploratory Data Analysis and Feature Engineering. Falcon 9 first stage will land successfully



Several examples of an unsuccessful landing are shown here:

Most unsuccessful landings are planned. Space X performs a controlled landing in the oceans.

Objectives

Perform exploratory Data Analysis and Feature Engineering using Pandas and Matplotlib

- Exploratory Data Analysis
- Preparing Data Feature Engineering

Import Libraries and Define Auxiliary Functions

We will import the following libraries the lab

Pandas is a software library written for the Python programming language for data manipulation and analysis.

import pandas as pd

NumPy is a library for the Python programming language, adding support for large, multi-dimensional arrays and matrices, along with a large collection of high-level mathematical functions to operate on these arrays

import numpy as np

Matplotlib is a plotting library for python and pyplot gives us a MatLab like plotting framework. We will use this in our plotter function to plot data.

import matplotlib.pyplot as plt

Seaborn is a Python data visualization library based on matplotlib. It provides a high-level interface for drawing attractive and informative statistical graphics

import seaborn as sns

Exploratory Data Analysis

First, let's read the SpaceX dataset into a Pandas dataframe and print its summary

In [2]:

df=pd.read_csv("https://cf-courses-data.s3.us.cloud-objectstorage.appdomain.cloud/IBM-DS0321EN-SkillsNetwork/datasets/dataset part 2.csv")

 $\mbox{\# If you were unable to complete the previous lab correctly you can uncomment and load this <math display="inline">csv$

df = pd.read_csv('https://cf-courses-data.s3.us.cloud-objectstorage.appdomain.cloud/IBMDeveloperSkillsNetwork-DS0701EN-SkillsNetwork/api/dataset part 2.csv')

df.head(5)

Out[2]: Flig Payl $\mathbf{F}\mathbf{I}$ GrВ Reu Lo Boos 0 La R Lan Ou htN terV oad unc id eu e din sed ngi tit įσ tco umb ersio Mas b hSi ht Fi se gPa Cou ia tud ud te me SS it d d k te er n ns 2 CC В 0 610 AF No F 28. L Fa 0 4.95 56 Falco S Fal Na 80. ne al 0 0 1 Е 0 ls n 9 941 SL577 18 No S N se O 0 C 57 0 40 6

| | Flig htN umb er | D a te | Boos terV ersio n | Payl oad Mas s | O r b it | La unc hSi te | Ou tco me | Fl ig ht s | Gr id Fi ns | R eu se d | L e g s | Lan din gPa d | B lo c k | Reu sed Cou nt | S er ia 1 | Lo ngi tud e | La tit ud e | C la ss |
|---|--------------------------|--|----------------------------|-------------------------|-------------------|--------------------------------|----------------------------|---------------------|----------------------|--------------------|-------------------|------------------------|-------------------|-------------------------|-----------------------|------------------------|-----------------------|---------------|
| | | 0 4 | | | | | | | | | | | | | | | | |
| 1 | 2 | 2 0 1 2 0 5 - 2 2 | Falco n 9 | 525. 000 000 | L E O | CC AF S SL C 40 | No ne No ne | 1 | Fal se | Fa ls e | F al s e | Na N | 1. 0 | 0 | B 0 0 0 5 | 80. 577 366 | 28. 56 18 57 | 0 |
| 2 | 3 | 2 0 1 3 - 0 3 - 0 | Falco n 9 | 677. 000 000 | I S S | CC AF S SL C 40 | No ne No ne | 1 | Fal se | Fa ls e | F al s e | Na N | 1. 0 | 0 | B 0 0 0 7 | 80. 577 366 | 28. 56 18 57 | 0 |
| 3 | 4 | 2 0 1 3 - 0 9 - 2 | Falco n 9 | 500. 000 000 | P O | VA FB SL C 4E | Fal se Oc ea n | 1 | Fal se | Fa ls e | F al s e | Na N | 1. 0 | 0 | B 1 0 0 3 | 120 .61 082 9 | 34. 63 20 93 | 0 |
| 4 | 5 | 2 0 1 3 - 1 2 - 0 3 | Falco n 9 | 317 0.00 000 0 | G T O | CC AF S SL C 40 | No ne No ne | 1 | Fal se | Fa ls e | F al s e | Na N | 1. 0 | 0 | B 1 0 0 4 | 80. 577 366 | 28. 56 18 57 | 0 |

First, let's try to see how the FlightNumber (indicating the continuous launch attempts.) and Payload variables would affect the launch outcome.

We can plot out the FlightNumber vs. PayloadMassand overlay the outcome of the launch. We see that as the flight number increases, the first stage is more likely to land successfully. The payload mass is also important; it seems the more massive the payload, the less likely the first stage will return.

We see that different launch sites have different success rates. CCAFS LC-40, has a success rate of 60 %, while KSC LC-39A and VAFB SLC 4E has a success rate of 77%.

Next, let's drill down to each site visualize its detailed launch records.

TASK 1: Visualize the relationship between Flight Number and Launch Site

Use the function catplot to plot FlightNumber vs LaunchSite, set the parameter x parameter to FlightNumber, set the y to Launch Site and set the parameter hue to 'class'

```
In [4]:
# Plot a scatter point chart with x axis to be Flight Number and y axis to
be the launch site, and hue to be the class value

sns.catplot(y="LaunchSite", x="FlightNumber", hue="Class", data=df, aspect
= 5)
plt.xlabel("Flight Number", fontsize=20)
plt.ylabel("Launch Site", fontsize=20)
plt.show()

CCAFS SLC 40

KSCLC 39A

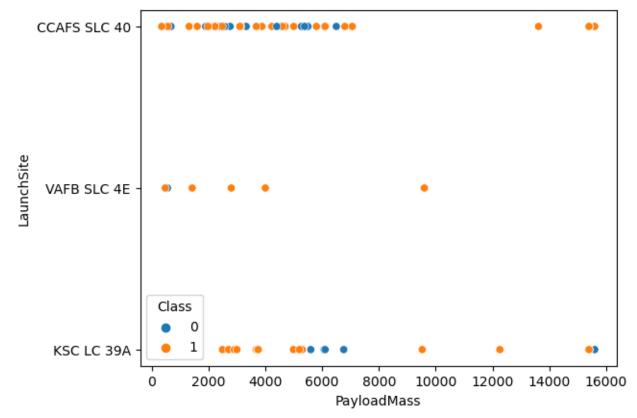
Flight Number
```

Now try to explain the patterns you found in the Flight Number vs. Launch Site scatter point plots.

TASK 2: Visualize the relationship between Payload and Launch Site

We also want to observe if there is any relationship between launch sites and their payload mass.

```
In [5]:
# Plot a scatter point chart with x axis to be Pay Load Mass (kg) and y
axis to be the launch site, and hue to be the class value
sns.scatterplot(data=df, x="PayloadMass", y="LaunchSite", hue="Class")
plt.show()
```



Now if you observe Payload Vs. Launch Site scatter point chart you will find for the VAFB-SLC launchsite there are no rockets launched for heavypayload mass(greater than 10000).

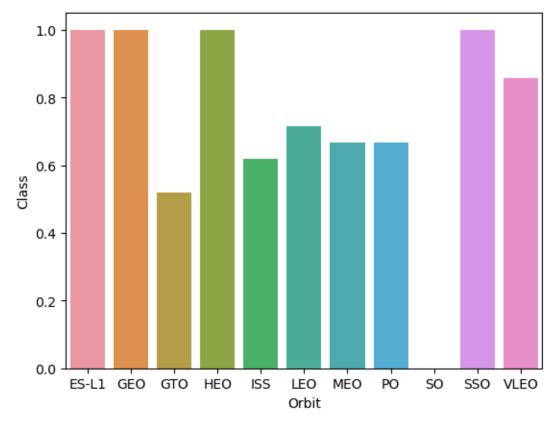
TASK 3: Visualize the relationship between success rate of each orbit type

Next, we want to visually check if there are any relationship between success rate and orbit type. Let's create a bar chart for the sucess rate of each orbit

```
In [6]:
# HINT use groupby method on Orbit column and get the mean of Class column

df_orbitsuccess = df.groupby('Orbit').mean().reset_index()

sns.barplot(data=df_orbitsuccess, x='Orbit', y='Class')
plt.show()
```



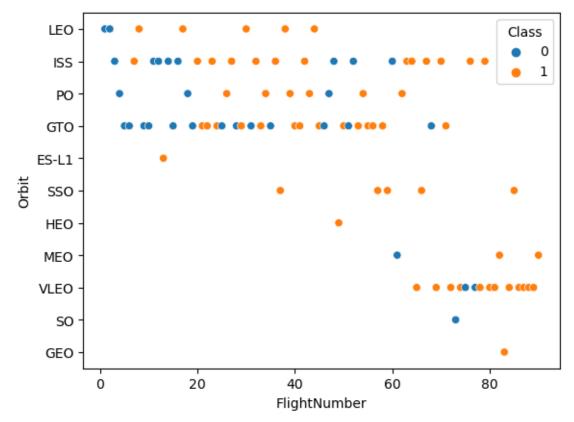
Analyze the ploted bar chart try to find which orbits have high sucess rate.

plt.show()

TASK 4: Visualize the relationship between FlightNumber and Orbit type

For each orbit, we want to see if there is any relationship between FlightNumber and Orbit type.

```
In [7]:
# Plot a scatter point chart with x axis to be FlightNumber and y axis to
be the Orbit, and hue to be the class value
sns.scatterplot(data=df, x='FlightNumber', y='Orbit', hue='Class')
```

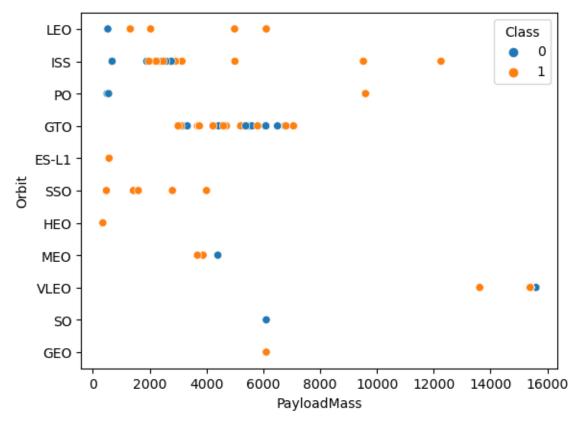


You should see that in the LEO orbit the Success appears related to the number of flights; on the other hand, there seems to be no relationship between flight number when in GTO orbit.

TASK 5: Visualize the relationship between Payload and Orbit type

Similarly, we can plot the Payload vs. Orbit scatter point charts to reveal the relationship between Payload and Orbit type

```
In [8]:
# Plot a scatter point chart with x axis to be Payload and y axis to be the
Orbit, and hue to be the class value
sns.scatterplot(data=df, x='PayloadMass', y='Orbit', hue='Class')
plt.show()
```



With heavy payloads the successful landing or positive landing rate are more for Polar, LEO and ISS.

However for GTO we cannot distinguish this well as both positive landing rate and negative landing (unsuccessful mission) are both there here.

TASK 6: Visualize the launch success yearly trend

You can plot a line chart with x axis to be Year and y axis to be average success rate, to get the average launch success trend.

The function will help you get the year from the date:

```
In [9]:
# A function to Extract years from the date

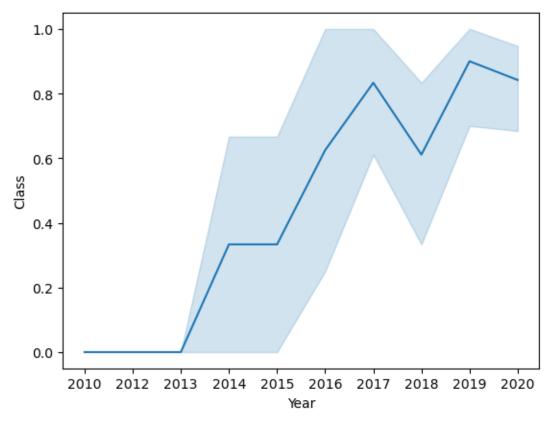
year=[]
def Extract_year(date):
    for i in df["Date"]:
        year.append(i.split("-")[0])
    return year

In [10]:

df['Year'] = Extract_year('Date')

In [11]:
# Plot a line chart with x axis to be the extracted year and y axis to be the success rate

sns.lineplot(data=df, x='Year', y='Class')
plt.show()
```



you can observe that the sucess rate since 2013 kept increasing till 2020

Features Engineering

By now, you should obtain some preliminary insights about how each important variable would affect the success rate, we will select the features that will be used in success prediction in the future module.

```
In [12]:
features = df[['FlightNumber', 'PayloadMass', 'Orbit', 'LaunchSite',
'Flights', 'GridFins', 'Reused', 'Legs', 'LandingPad', 'Block',
'ReusedCount', 'Serial']]
features.head()
```

| | | | | | | | | | | | 0 | ut[12]: |
|---|------------------|-----------------|-----------|-----------------|-------------|--------------|------------|-----------|----------------|-----------|-----------------|------------|
| | FlightNu mber | Payload Mass | Or bit | Launch Site | Flig hts | GridF ins | Reus ed | Le gs | Landing Pad | Blo ck | ReusedC ount | Seri al |
| 0 | 1 | 6104.959 412 | LE O | CCAFS SLC 40 | 1 | False | False | Fal se | NaN | 1.0 | 0 | B00 03 |
| 1 | 2 | 525.0000 00 | LE O | CCAFS SLC 40 | 1 | False | False | Fal se | NaN | 1.0 | 0 | B00 05 |
| 2 | 3 | 677.0000 00 | ISS | CCAFS SLC 40 | 1 | False | False | Fal se | NaN | 1.0 | 0 | B00 07 |

| | FlightNu mber | Payload Mass | Or bit | Launch Site | Flig hts | GridF ins | Reus ed | Le gs | Landing Pad | Blo ck | ReusedC ount | Seri al |
|---|------------------|-----------------|-----------|-----------------|-------------|--------------|------------|-----------|----------------|-----------|-----------------|------------|
| 3 | 4 | 500.0000 | РО | VAFB SLC 4E | 1 | False | False | Fal se | NaN | 1.0 | 0 | B10 03 |
| 4 | 5 | 3170.000 000 | GT O | CCAFS SLC 40 | 1 | False | False | Fal se | NaN | 1.0 | 0 | B10 04 |

TASK 7: Create dummy variables to categorical columns

Use the function get_dummies and features dataframe to apply OneHotEncoder to the column Orbits, LaunchSite, LandingPad, and Serial. Assign the value to the variable features_one_hot, display the results using the method head. Your result dataframe must include all features including the encoded ones.

```
In [13]:
# HINT: Use get dummies() function on the categorical columns
features one hot = pd.get dummies(features, columns=['Orbit', 'LaunchSite',
'LandingPad', 'Serial'])
features one hot.head()
                                                                                                                 Out[13]:
                                                0
                                                      \mathbf{o}
     Fli
           Pa
                      G
                 F
                           R
                                         Re
                                                               Se
                                                                     Se
                                                                           Se
                                                                                 Se
                                                                                        Se
                                                                                              Se
                                                                                                    Se
                                                                                                          Se
                                                                                                                Se
                                                                                                                       Se
                                    В
     gh
            yl
                      ri
                                                     rb
                 li
                                                bi
                                                               ri
                                                                     ri
                                                                            ri
                                                                                                     ri
                                                                                                                 ri
                                                                                                                       ri
                            \mathbf{e}
                                L
                                          us
                                                                                  ri
                                                                                        ri
                                                                                              ri
                                                                                                           ri
     tΝ
                       d
                                     l
           oa
                                                      it
                           u
                                e
                                         ed
                                                t_{-}
                                                               al
                                                                     al
                                                                            al
                                                                                  al
                                                                                        al
                                                                                              al
                                                                                                    al
                                                                                                           al
                                                                                                                 al
                                                                                                                       al
                 \mathbf{g}
                       F
      u
            d
                                    0
                                                     \bar{\mathbf{G}}
                                                \mathbf{E}
                 h
                                          \mathbf{C}
                                                               _{\mathbf{B}}
                                                                     _{\mathbf{B}}
                                                                           _{\mathbf{B}}
                                                                                 _{\mathbf{B}}
                                                                                       _{\mathbf{B}}
                                                                                             _B
                                                                                                    _B
                                                                                                          _B
                                                                                                                _{\mathbf{B}}
                                                                                                                      _{\mathbf{B}}
                            \mathbf{S}
                                g
      m
            M
                       i
                                     c
                                                                     10
                                                                                                                10
                                                S-
                                                               10
                                                                           10
                                                                                 10
                                                                                       10
                                                                                              10
                                                                                                    10
                                                                                                          10
                                                                                                                      10
                                          ou
                                                      \mathbf{E}
                                    k
     be
            as
                       n
                                                L
                                                               48
                                                                     49
                                                                           50
                                                                                 51
                                                                                       54
                                                                                              56
                                                                                                    58
                                                                                                          59
                                                                                                                60
                            d
                                                                                                                       62
                                          nt
                                                      O
      r
           61
                            F
                                F
           04
                       F
                                    1
                            a
                                a
            .9
                      al
      1
                 1
                                                      0
                                                                0
                                                                      0
                                                                            0
                                                                                   0
                                                                                         0
                                                                                               0
                                                                                                     0
                                                                                                           0
 0
                            1
                                1
                                           0
                                                0
           59
                       \mathbf{S}
                                    0
                            S
                                S
            41
            2
            52
                       F
            5.
                            a
                                a
                                    1
                      al
      2
           00
 1
                  1
                            1
                                1
                                           0
                                                0
                                                      0
                                                                0
                                                                      0
                                                                            0
                                                                                   0
                                                                                         0
                                                                                               0
                                                                                                     0
                                                                                                           0
                                                                                                                 0
                       S
           00
                                    0
                            \mathbf{S}
                                S
           00
            67
                            F
                                F
                       F
            7.
                                    1
                            a
                                a
                      al
                 1
                                                                                                           0
 2
      3
           00
                                                0
                                                      0
                                                                0
                                                                            0
                                                                                   0
                                                                                         0
                                                                                               0
                            1
                                1
                       S
                                    0
           00
                                S
```

00

| | gh tN u m be r | yl oa d M as | li g h t s | ri d F i n | e u s e d | L e g s | B l o c k | us ed C ou nt | bi t_ E S- L 1 | rb it G E O | ri al _B 10 48 | ri al _B 10 49 | ri al _B 10 50 | ri al _B 10 51 | ri al _B 10 54 | ri al _B 10 56 | ri al _B 10 58 | ri al _B 10 59 | ri al _B 10 60 | ri al _B 10 62 |
|---|-------------------------------|---------------------------------|------------------------|------------------------|-----------------------|-----------------------|-----------------------|---------------------------|-------------------------------|-------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|----------------------------|
| 3 | 4 | 50 0. 00 00 00 | 1 | F al s e | F a l s e | F a l s e | 1 . 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |
| 4 | 5 | 31 70 .0 00 00 0 | 1 | F al s e | F a l s e | F a l s e | 1 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 | 0 |

5 rows × 80 columns