

# Winning Space Race with Data Science

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#### Outline

- Executive Summary
- Introduction
- Methodology
- Results
- Conclusion
- Appendix

#### **Executive Summary**

- Summary of methodologies
- Data collection methodology: API and web scrapping
- Perform data wrangling: Data Transformation, , Encoding categorical features, Data formatting.
- Perform exploratory data analysis (EDA) using visualization and SQL
- Perform interactive visual analytics using Folium and Plotly Dash
- Perform predictive analysis using classification models

- Summary of all results
- Exploratory data analysis results
- Interactive analytics demo in screenshots
- Predictive analysis results

#### Introduction

- Project background and context
- Space X 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 because Space X can reuse the first stage.

• Problem:

**Space X Falcon 9 First Stage Landing Prediction** 



### Methodology

#### **Executive Summary**

- Data collection methodology:
  - API and Web Scraping
- Perform data wrangling
  - Data transformation, Encoding categorical features, Data formating
- Perform exploratory data analysis (EDA) using visualization and SQL
- Perform interactive visual analytics using Folium and Plotly Dash
- Perform predictive analysis using classification models
  - Standardize the features, Split data into training and testing, Tune Hyperparameter with Grid Search CV, find best parameters, find accuracy score and choose best model.

#### **Data Collection**

- API requests to spacex website:
  - . Make get requests to spacex API

- Web Scraping:
  - Web scrap Falcon 9 launch records with BeautifulSoup:
    - . Extract Falcon 9 launch records HTML table from Wikipedia.
    - . Parse the table and convert into a Pandas data frame.

### Data Collection - SpaceX API

- Get Booster Version data Get Luanch Sites data Get Payloads data Get Cores data Get Past Launches data
- 2.https://github.com/me-intech/DataScienceCapstone/blob/4c6 4e3df9c57342e1b0383947f7e5c7c39 9835f3/1.%20jupyter-labs-spacexdata-collection-api.ipynb

```
https://api.spacexdata.com/v4/r
            ockets/
https://api.spacexdata.com/v4/l
          aunchpads/
https://api.spacexdata.com/v4/p
           ayloads/
https://api.spacexdata.com/v4/c
             ores/
https://api.spacexdata.com/v4/l
         aunches/past
```

## **Data Collection - Scraping**

 Use BeautifulSoup, extract HTML tables, Parse the tables.

 https://github.com/me-intech/DataScienceCapstone/blo b/4c64e3df9c57342e1b03839 47f7e5c7c399835f3/2.%20jup yter-labsspacex%20data%20collection %20webscraping.ipynb Get data from wikipedia using get requests.

Create beautifulSoup object with html parser

Extract all columns/variables from the HTML table header

Create data frame by parsing the launch HTML tables

#### **Data Wrangling**

Calculate the number of launches on each site
 Calculate the number of occurrence of each orbit
 Calculate the number and occurrence of mission outcome of the orbits
 Create landing outcome label from Outcome column.

• https://github.com/me-in-tech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399 835f3/3.%20labs-jupyter-spacex-Data%20wrangling.ipynb

#### **EDA** with Data Visualization

- Plots prepared for feature engineering.
  - . Categorical Plot for relationship between flight number and launch site.
  - . Categorical Plot for relationship between payload mass and launch site.
  - . Bar Plot for relationship between success rate of each orbit type.
  - . Categorical Plot for relationship between flightnumber and orbit type.
  - . Categorical Plot for relationship between payload and mass and orbit type.
  - . Line Plot for Launch success yearly trend.
  - After, select the features which will be used in success prediction.
  - Create dummy variables (one hot encoding) of categorical features.

 https://github.com/me-intech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399835f3/ 5.%20eda%20data%20visualization.ipynb

#### EDA with SQL

Make sqlite3 connection with the database.
 Make a cursor through the connection to perform querring.
 Connect the database using SQL magic within jupyter notebook

 https://github.com/me-intech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399835f3/ 4.%20jupyter-labs-eda-sql-coursera\_sqllite.ipynb

#### Build an Interactive Map with Folium

•

Circle object to mark the location of launch site.

Marker object to put the name of the site.

Marker Clusters to show success/failure numbers at the site.

 https://github.com/me-intech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399835f3/7.%20l ab\_jupyter\_launch\_site\_location.ipynb

### Build a Dashboard with Plotly Dash

• Pie chart to show the proportion of success and failure of each site launches. Scatter plot to show the correlation between payload and launch success.

 https://github.com/me-intech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399835f3/ 8.%20spacex\_dash\_app.py

### Predictive Analysis (Classification)

- create a column for the class
- Standardize the data
- Split into training data and test data
- Find best Hyperparameter for SVM, Classification Trees and Logistic Regression
- Find the method performs best using test data

 https://github.com/me-intech/DataScienceCapstone/blob/4c64e3df9c57342e1b0383947f7e5c7c399835f3/ 6.%20SpaceX\_Machine%20Learning%20Prediction\_Part\_5.ipynb

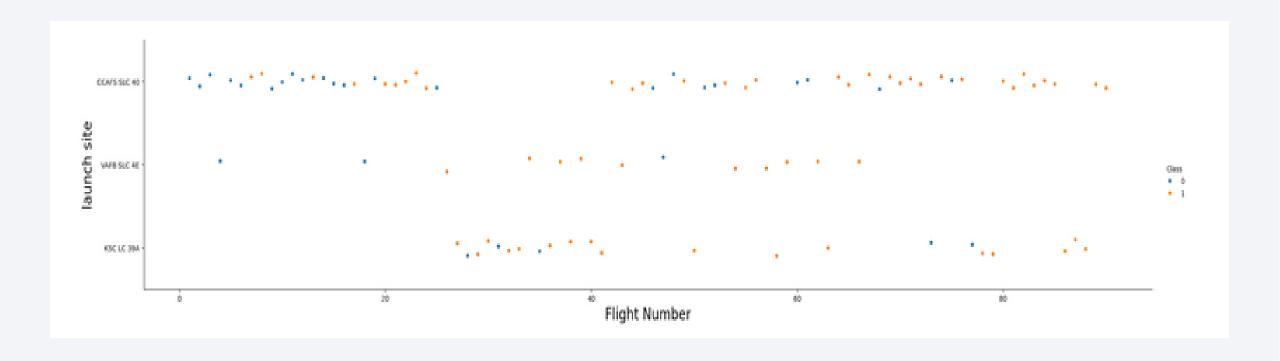
#### Results

• Features selected are FlightNumber, PayloadMass, Orbit, Launch Site, Flights, GridFins Reused Legs, Landingpad, Block ResuedCount, Serial.

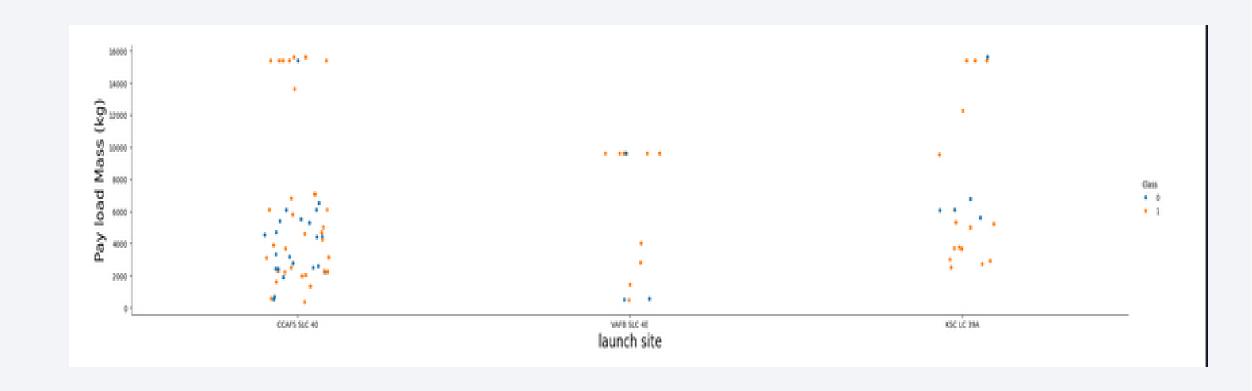
 Decision Tree classifier performed best with training data accuracy of 86.25% and test data accuracy 83.33%



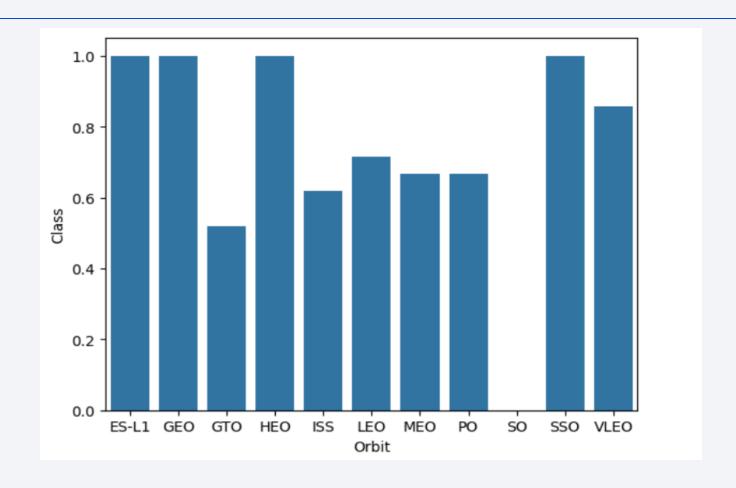
### Flight Number vs. Launch Site



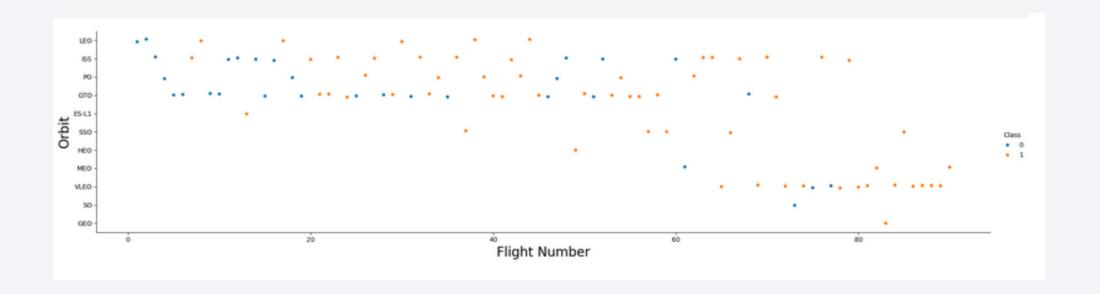
# Payload vs. Launch Site



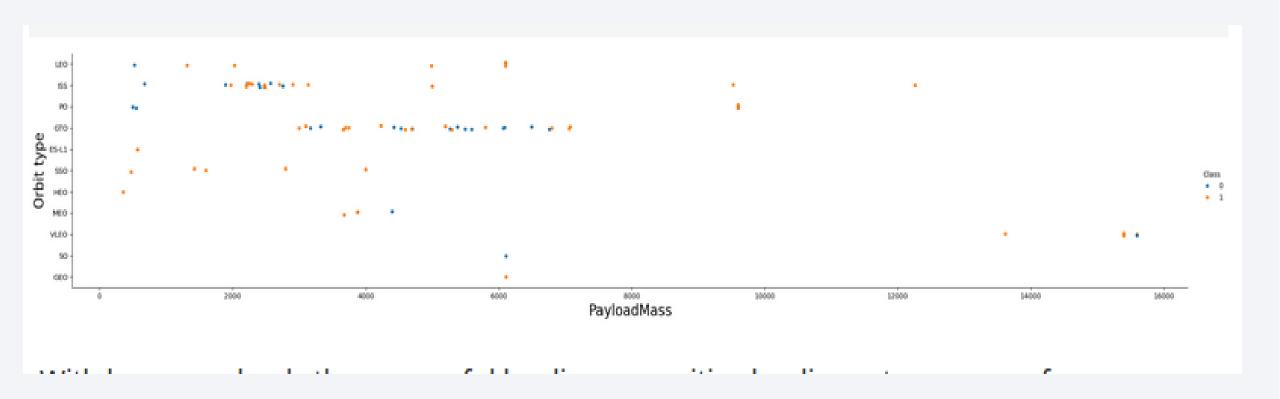
# Success Rate vs. Orbit Type



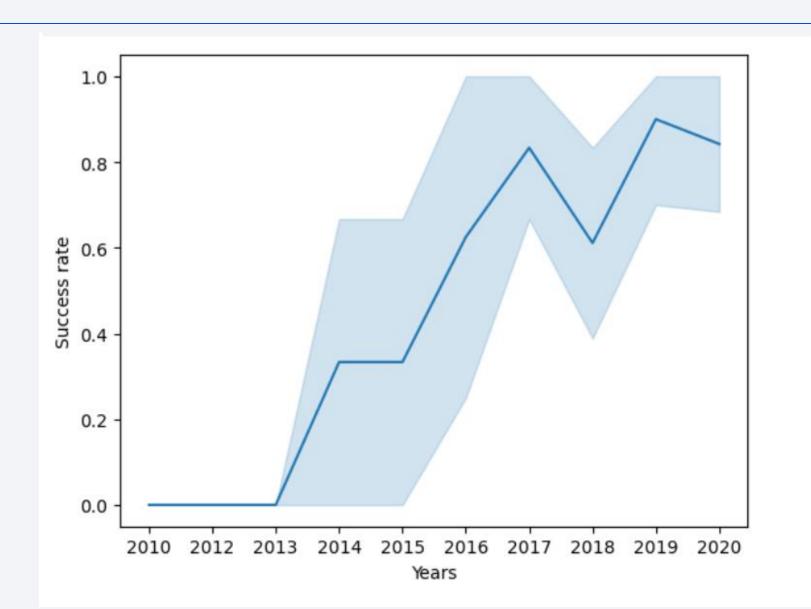
# Flight Number vs. Orbit Type



## Payload vs. Orbit Type



# Launch Success Yearly Trend



#### All Launch Site Names

Names of the unique launch sites

CCAFS LC-40

VAFB SLC-4E

KSC LC-39A

CCAFS SLC-40

%sql SELECT DISTINCT Launch\_Site FROM SPACEXTABLE;

## Launch Site Names Begin with 'CCA'

5 records where launch sites begin with `CCA`

```
CCAFS LC-40
```

CCAFS LC-40

CCAFS LC-40

CCAFS LC-40

CCAFS LC-40

 %sql SELECT Launch\_Site FROM SPACEXTABLE WHERE Launch\_Site LIKE 'CCA%' LIMIT 5;

### **Total Payload Mass**

Total payload carried by boosters from NASA:
 45596

 %sql SELECT SUM(PAYLOAD\_MASS\_\_KG\_) FROM SPACEXTABLE WHERE Customer LIKE 'NASA (CRS%)';

#### Average Payload Mass by F9 v1.1

Average payload mass carried by booster version F9 v1.1
 2534.6666666666666

• %sql SELECT AVG(PAYLOAD\_MASS\_\_KG\_) FROM SPACEXTABLE WHERE Booster\_Version LIKE 'F9 v1.1%';

## First Successful Ground Landing Date

• Dates of the first successful landing outcome on ground pad: 2010-06-04

 %sql SELECT MIN(Date) FROM SPACEXTABLE WHERE Mission\_Outcome LIKE 'Success';

#### Successful Drone Ship Landing with Payload between 4000 and 6000

• List the names of boosters which have successfully landed on drone ship and had payload mass greater than 4000 but less than 6000:

```
F9 FT B1022
F9 FT B1026
F9 FT B1021.2
F9 FT B1031.2
```

- %%sql SELECT Booster\_Version
- FROM SPACEXTABLE
- WHERE Landing\_Outcome LIKE "Success (drone ship)"
- AND PAYLOAD\_MASS\_\_KG\_ > 4000
- AND PAYLOAD\_MASS\_\_KG\_ < 6000;</li>

#### Total Number of Successful and Failure Mission Outcomes

• Total number of successful and failure mission outcomes:

Controlled (ocean)	5
Failure	3
Failure (drone ship)	5
Failure (parachute)	2
No attempt	21
No attempt	1
Precluded (drone ship)	1
Success	38
Success (drone ship)	14
Success (ground pad)	9
Uncontrolled (ocean)	2

%sql SELECT DISTINCT Landing\_Outcome, COUNT(Landing\_Outcome)
 FROM SPACEXTABLE GROUP BY Landing\_Outcome;

#### **Boosters Carried Maximum Payload**

```
• List the names of the booster which have carried the maximum payload mass
     F9 B5 B1048.4
     F9 B5 B1049.4
     F9 B5 B1051.3
     F9 B5 B1056.4
     F9 B5 B1048.5
     F9 B5 B1051.4
     F9 B5 B1049.5
     F9 B5 B1060.2
     F9 B5 B1058.3
     F9 B5 B1051.6
     F9 B5 B1060.3
F9 B5 B1049.7
• %sql SELECT Booster_Version FROM SPACEXTABLE WHERE
  PAYLOAD MASS KG IN (SELECT MAX(PAYLOAD MASS KG ) FROM
  SPACEXTABLE);
```

#### 2015 Launch Records

 List the failed landing\_outcomes in drone ship, their booster versions, and launch site names for in year 2015

F9 B5 B1051.4

F9 B5 B1049.5

F9 B5 B1060.2

F9 B5 B1058.3

F9 B5 B1051.6

%sql SELECT Booster\_Version FROM SPACEXTABLE WHERE Date LIKE
 '2015%' AND Landing Outcome LIKE 'Failure(drone ship)';

#### Rank Landing Outcomes Between 2010-06-04 and 2017-03-20

• Rank the count of landing outcomes (such as Failure (drone ship) or Success (ground pad)) between the date 2010-06-04 and 2017-03-20, in

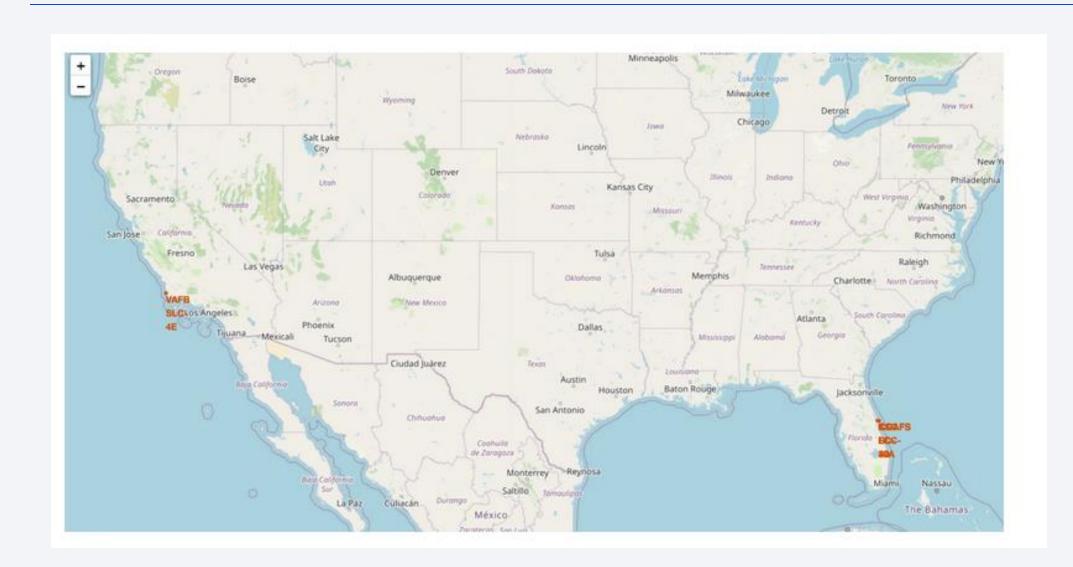
descending order	Landing_Outcome	Outcome_Count
	No attempt	10
	Success (drone ship)	5
	Failure (drone ship)	5
	Success (ground pad)	3
	Controlled (ocean)	3
	Uncontrolled (ocean)	2
	Failure (parachute)	2
%%sql	Precluded (drone ship)	1

SELECT Landing\_Outcome, COUNT(\*) AS Outcome\_Count

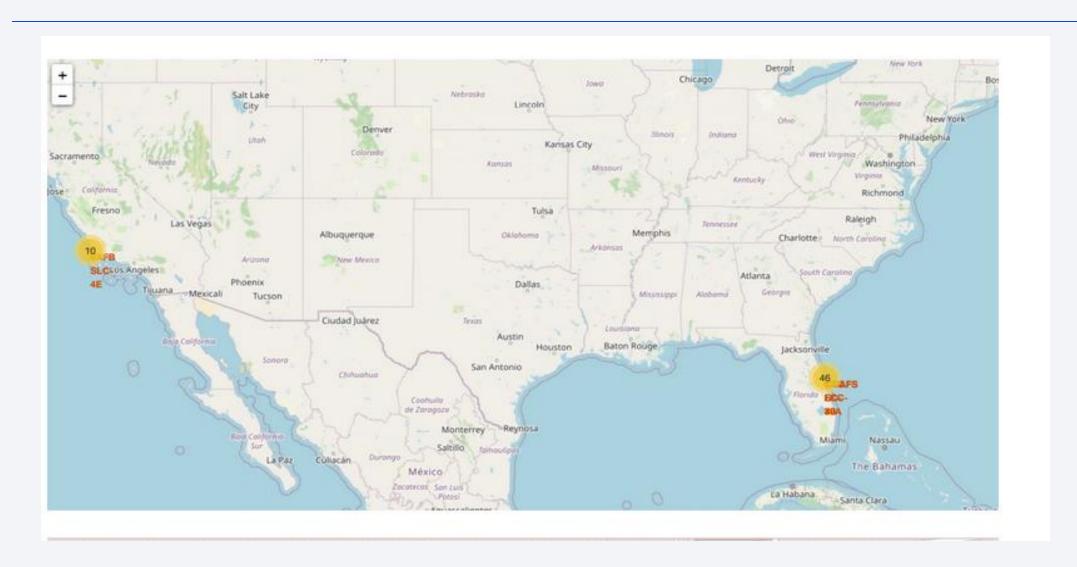
FROM SPACEXTABLE



## All launch sites marking on a map



## Add Circle object to the marked sites

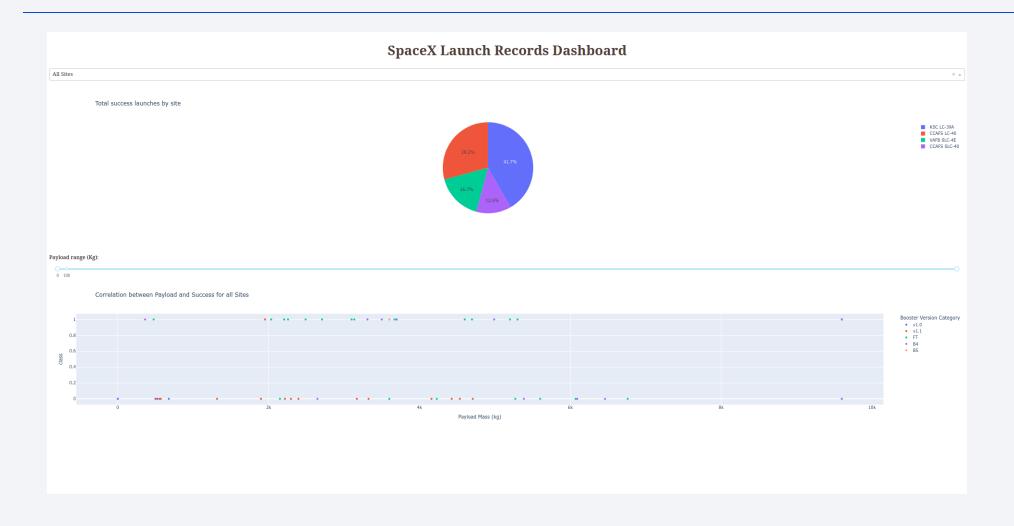


## Add Success/Failure markers to each site

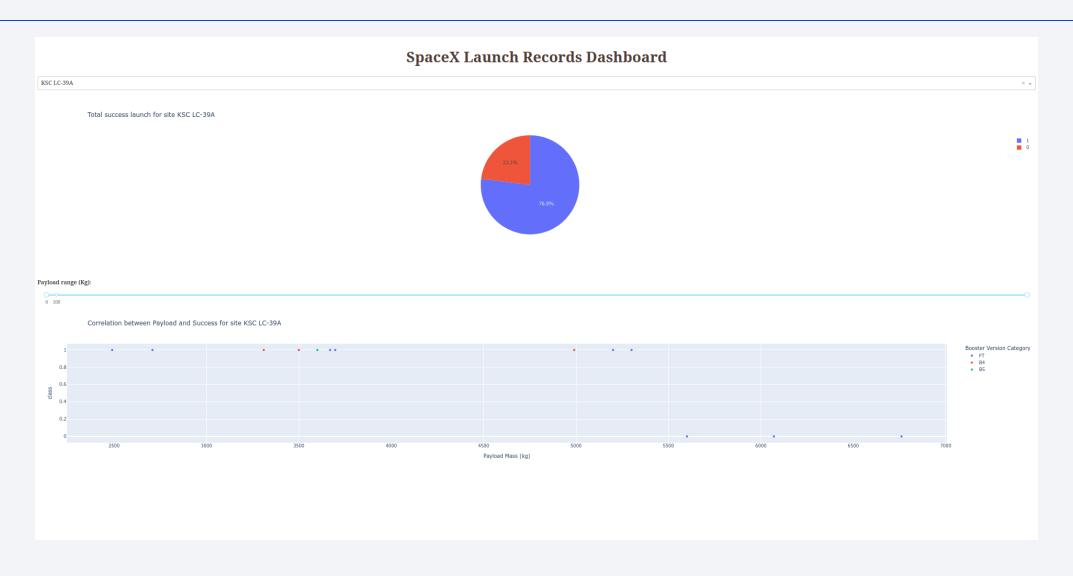




# Total success launches by sites

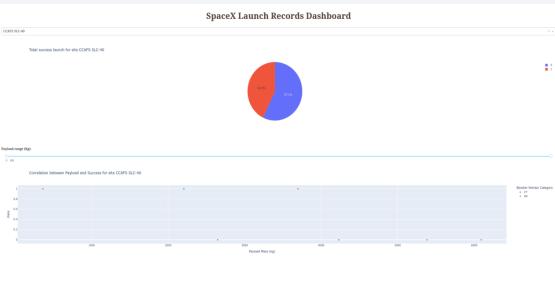


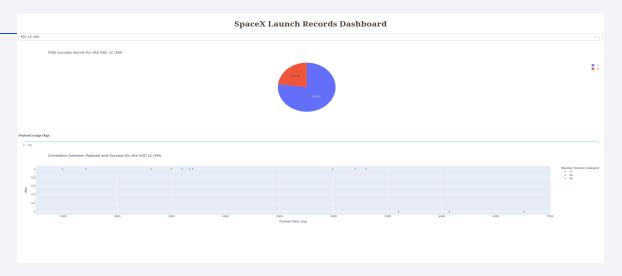
## Highest launch success rate: KSC LC-39A

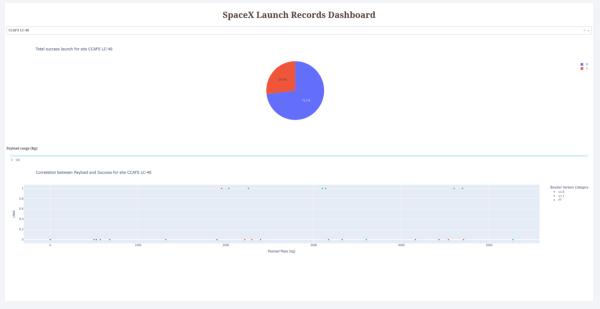


#### Pie and Scatter charts of all sites







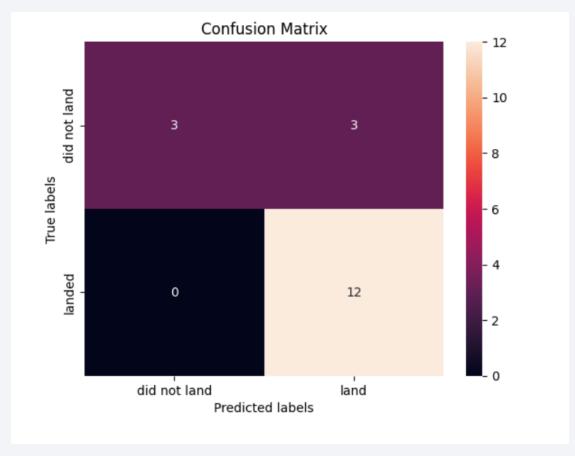




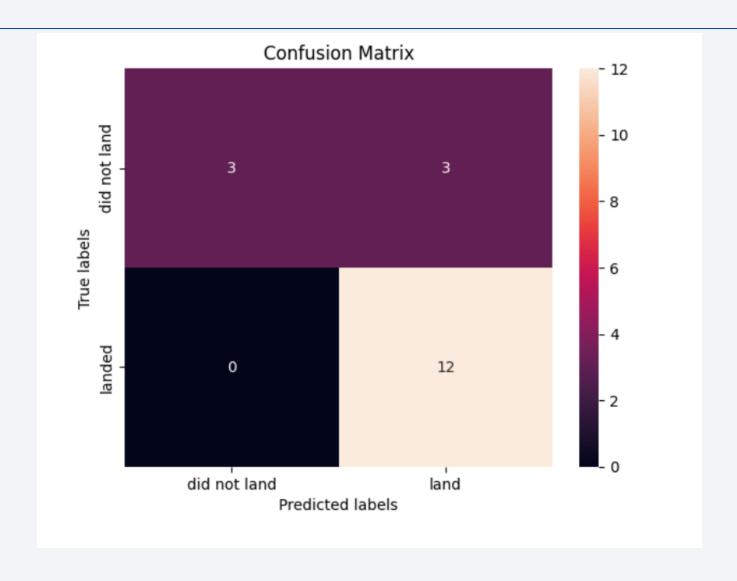
## Classification Accuracy

• Decision tree classifier performed best with training data accuracy of 86.25% and test data

accuracy 83.33%



#### **Confusion Matrix**



#### **Conclusions**

- Data collection was done using API and webscrapping.
- Performed Data wrangling on the acquired data.
- Performed EDA with SQL and Visualization and predictive features were selected.
- Different model were fitted to the data get the best accuracy and acquired best parameters of each model.
- Decision Tree Classifier performed best.
- Launch sites were marked using folium, with success/failure markings on each site.

## **Appendix**

SpaceX launch data.

```
static_json_url='https://cf-courses-data.s3.us.cloud-object-
storage.appdomain.cloud/IBM-DS0321EN-
SkillsNetwork/datasets/API_call_spacex_api.json'
```

• List of Falcon 9 and Falcon Heavy launches wikipage updated on 9th June 2021.

```
static_url =
"https://en.wikipedia.org/w/index.php?title=List_of_Falcon_9_and_Fa
lcon_Heavy_launches&oldid=1027686922"
```

