



IBM Developer
SKILLS NETWORK

Winning Space Race with Data Science

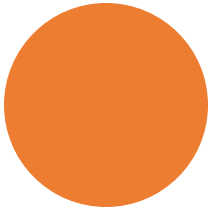
Hasan DASDEMIR

October 1, 2021

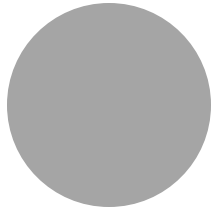




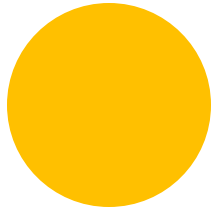
Outline



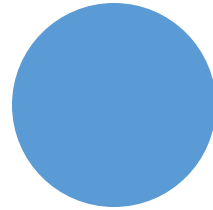
EXECUTIVE
SUMMARY



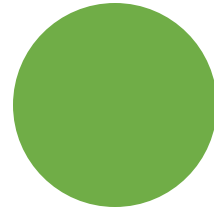
INTRODUCTION



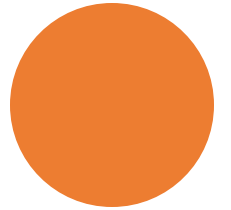
METHODOLOGY



RESULTS



CONCLUSION



APPENDIX

Executive Summary

Summary of Methodologies

- Data Collection & Wrangling
- EDA (Python & SQL)
- Interactive Analytics
 - Map (Folium)
 - Dashboard (Ploty)
- Clasification

Summary of Results

- EDA Result
- Analytics - Dashboard
- Predictive Analysis

Introduction

Project & Context

- Sending spacecraft to the International Space Station.
- If the first stage will land successfully, we can determine the cost of a launch.
- The second stage, helps bring the payload to orbit,

Problems

- Are we going to use first stage for the save money?
- We are going to try to predict whether SpaceY will attempt to land rocket or not.
- If SpaceY will reuse the first stage then we can save some money

Methodology



Methodology

Data collection

- SpaceX API
 - Launches, rocket info, payload delivered, launch & landing specifications, and landing outcome.
- Web Scraping Wikipedia

Data Wrangling

- Dropping unnecessary columns
- Finding features

EDA

- Matplotlib
- SQL

Visual Analytics

- Folium
- Plotly Dash

Predictive Analysis

- Classification

Data Collection

SpaceX API

Github URL

Web Scraping

Github URL

EDA

Github URL

EDA Dataviz

Github URL

EDA SQL

Github URL

Data Collection - SpaceX API

SpaceX API

Github URL

1.Request SpaceX API

2.Clean requested data

3.Construct API dataset

4.Filter Falcon 9

5.Deal Missing
Values

6.Export dataset

.csv dataset

Github URL

Data Collection - Web Scraping

Web Scraping

Github URL

1.Request Falcon 9
Wiki Page

2.Create BeautifulSoup

3.Extract all columns

4.Parsing
HTML table

5.Creat & fill
launch dict.

6.Export dataset

.csv dataset

Github URL

Data Wrangling

Perform exploratory Data Analysis and determine Training Labels

EDA
Github URL

1.Load
Space X dataset

2.Calculate
Sites Launches

3.Calculate
Orbit occurrence

4.Calculate
outcome orbit type

5.Create
landing outcome label

6.Export
dataset

.csv dataset
Github URL

EDA with Data Visualization

Perform Wxploratory Data Analysis and determine Training Labels or Features

EDA Dataviz

[Github URL](#)

1.Load
SpaceX dataset

2.Plot
FlightNumber
vs LaunchSite

3.Plot
Payload vs
LaunchSite

4.Plot
Success rate vs
orbit

5.Plot
FlightNumber vs
Orbit

6.Plot
Payload vs Orbit

7.Plot
Success Rate vs
Trend

8.Export
Features dataset

.csv dataset

[Github URL](#)

EDA with SQL

Getting more information to understand the SpaceX Dataset

EDA SQL
Github URL

1. Display the names of the unique launch sites in the space mission
2. Display 5 records where launch sites begin with the string 'CCA'
3. Display the total payload mass carried by boosters launched by NASA (CRS)
4. Display average payload mass carried by booster version F9 v1.1
5. List the date when the first successful landing outcome in ground pad was achieved.
6. List the names of the boosters which have success in drone ship and have payload mass greater than 4000 but less than 6000
7. List the total number of successful and failure mission outcomes
8. List the names of the booster_versions which have carried the maximum payload mass. Use a subquery
9. List the failed landing_outcomes in drone ship, their booster versions, and launch site names for in year 2015
10. 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

Build an Interactive Map with Folium

Launch Sites Location Analysis / Interactive Visual Analytics with Folium

[Map Folium](#)
Githup URL

1. Mark Launch sites on a map

- To see
Exact Launch locations

2. Mark the success/failed launches

- To see
which sites have high success rates

3. Calculate the distances between a launch site to its proximities

- To see
Points of interests
 - Railways
 - Highways
 - Costline
 - Cities

Build a Dashboard with Plotly Dash

- Summarize what plots/graphs and interactions you have added to a dashboard
- Explain why you added those plots and interactions
- Add the GitHub URL of your completed Plotly Dash lab, as an external reference and peer-review purpose

Build a Dashboard with Plotly Dash

interactive visual analytics on SpaceX launch data in real-time

Dashboard
with
Plotly
Github URL

1. Add Drop-down

- To show and select a Launch Sites

2.Add Callback function

- To render success-pie-chart based on selected site dropdown

3.Add Range Slider

- To Select Payload

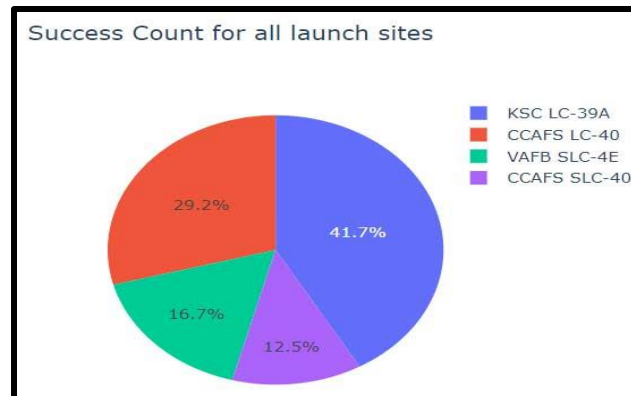
4.Add Callback function

- To render success-payload-scatter-chart scatter plot

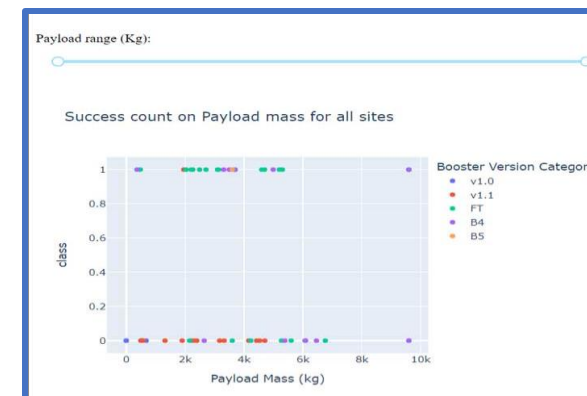
Dropdown menu showing launch sites:

- All Sites
- CCAFS LC-40
- CCAFS SLC-40
- KSC LC-39A
- VAFB SLC-4E

DropDown : Show and select all or single site to interact pieChart



PieChart : Shows Success Count for all or single site



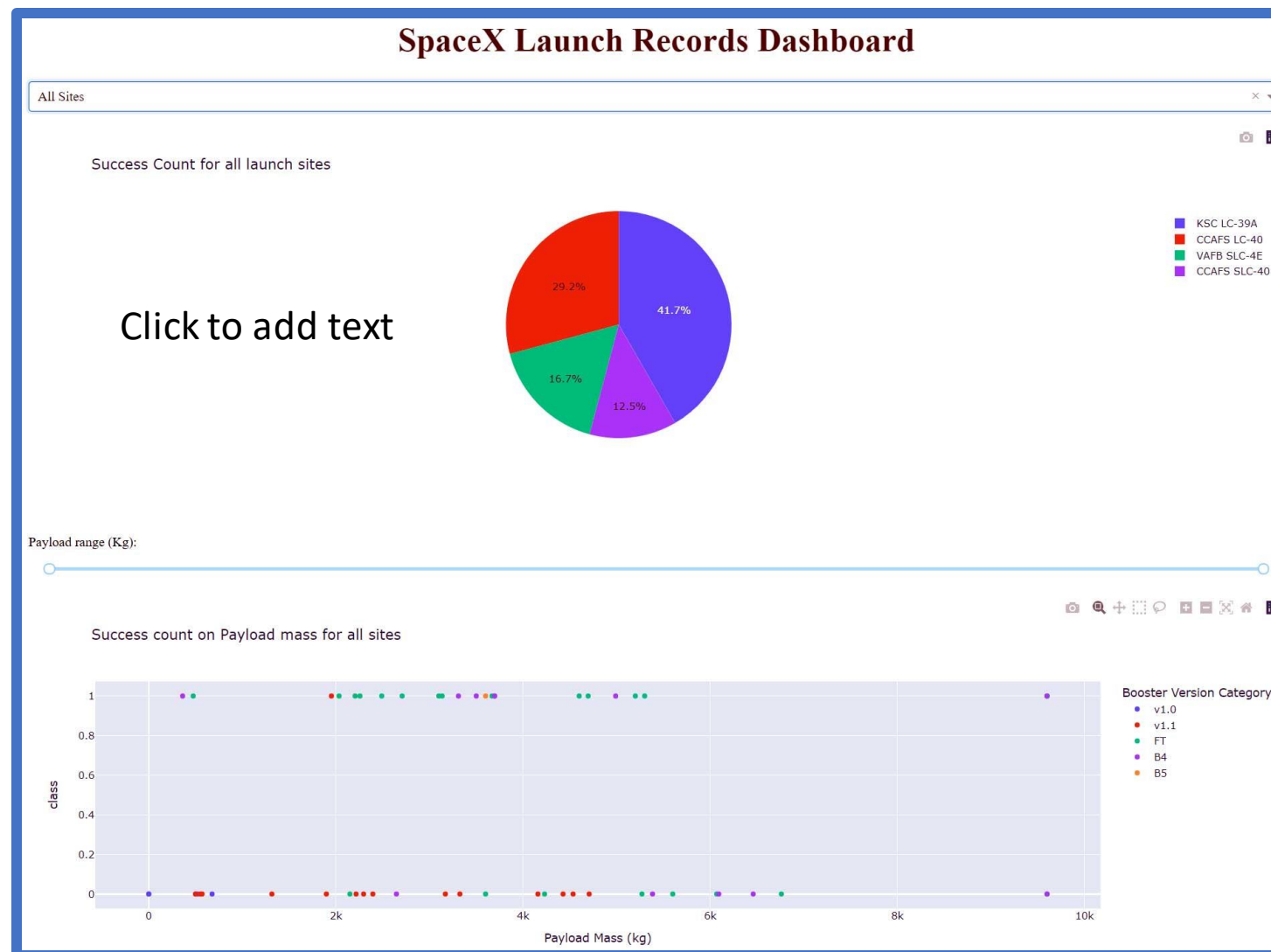
Scatter : Shows the relationship Outcome and Payload Mass.

See FullScreen Dash on next slide

Build a Dashboard with Plotly Dash

interactive visual analytics on SpaceX launch data in real-time

Dashboard
with
Plotly
Github URL



Predictive Analysis (Classification)

- Summarize how you built, evaluated, improved, and found the best performing classification model
- You need present your development process using key phrases and flowchart
- Add the GitHub URL of your completed predictive analysis lab, as an external reference and peer-review

BUILDING MODE

- Dataset
- LOAD
- TRANSFORM
- SPLIT (Test & Train)
- CHECK Sample
- WHICH Algorithm
- SET Parameters
- TRAIN Dataset

EVALUATING MODEL

- CHECK Accuracy
- TUNE Hyperparameters

IMPROVING MODEL

- Feature Engineering
- Compare Algorithm
- SELECT Best Performance

Predictive Analysis (Classification)

Machine Learning Prediction

Github URL

BUILDING MODE

- **Dataset**
- LOAD
- TRANSFORM
- SPLIT (Test & Train)
- CHECK Sample
- WHICH Algorithm
- SET Parameters
- TRAIN Dataset

EVALUATING MODEL

- CHECK Acuracy
- TUNE Hiperparameters

IMPROVING MODEL

- FEATURE Engineering
- COMPARE Algorithm
- SELECT Best Performance

Result

Exploratory data analysis / Interactive Analytics / Predictive Analysis

Exploratory data analysis results

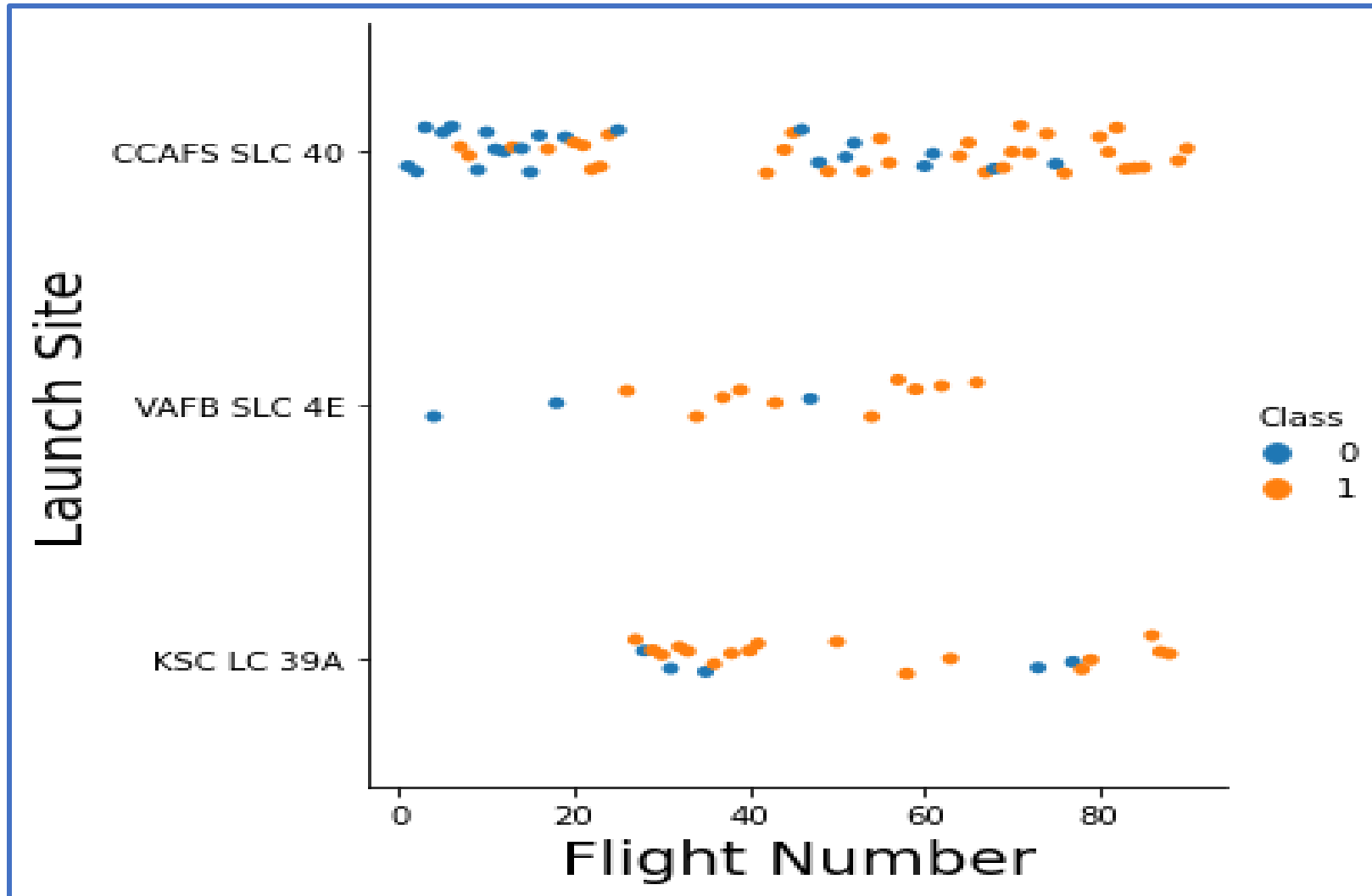
Interactive analytics demo in
screenshots

Predictive analysis results

Insights drawn from EDA

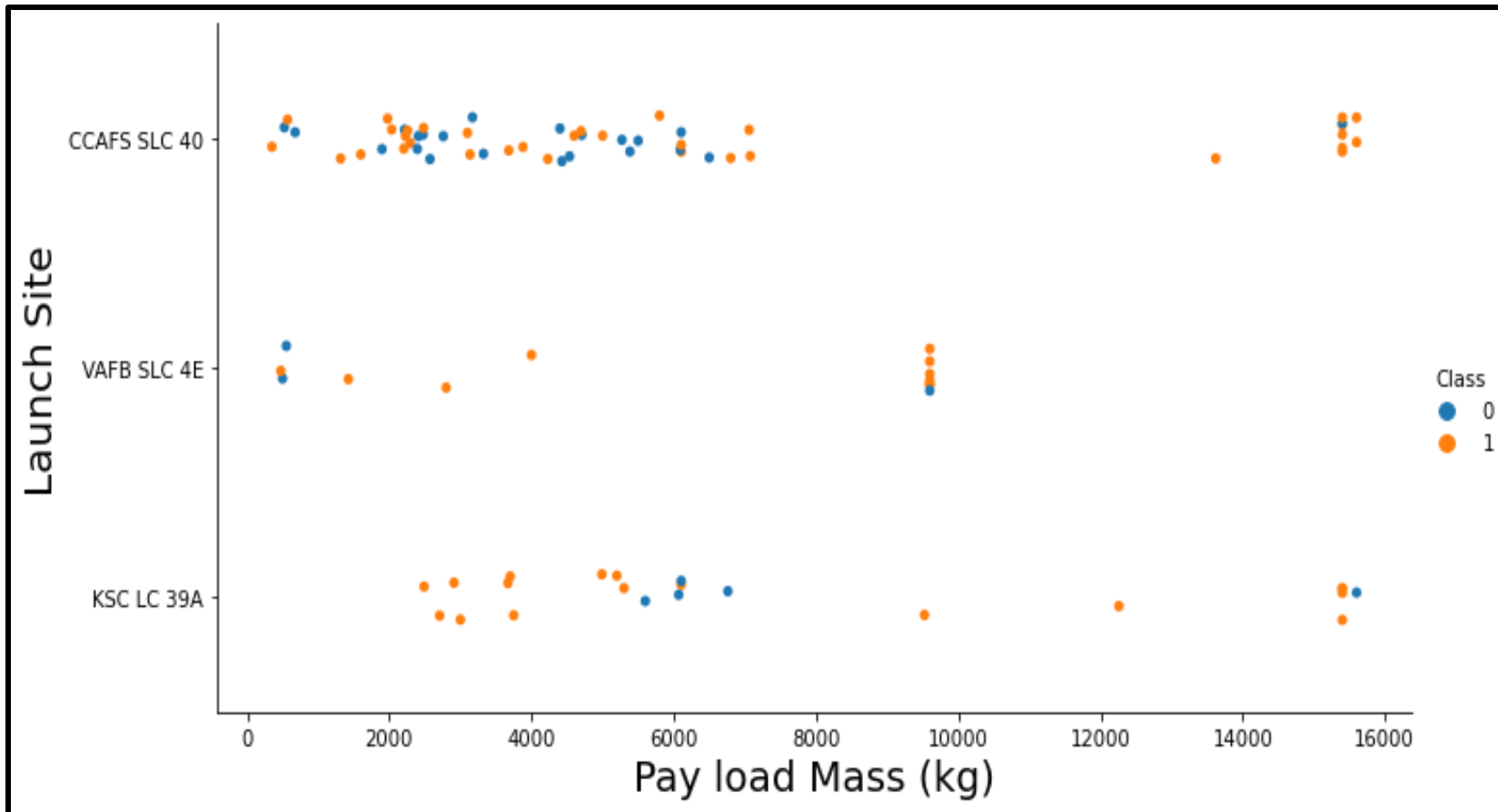


Flight Number vs. Launch Site



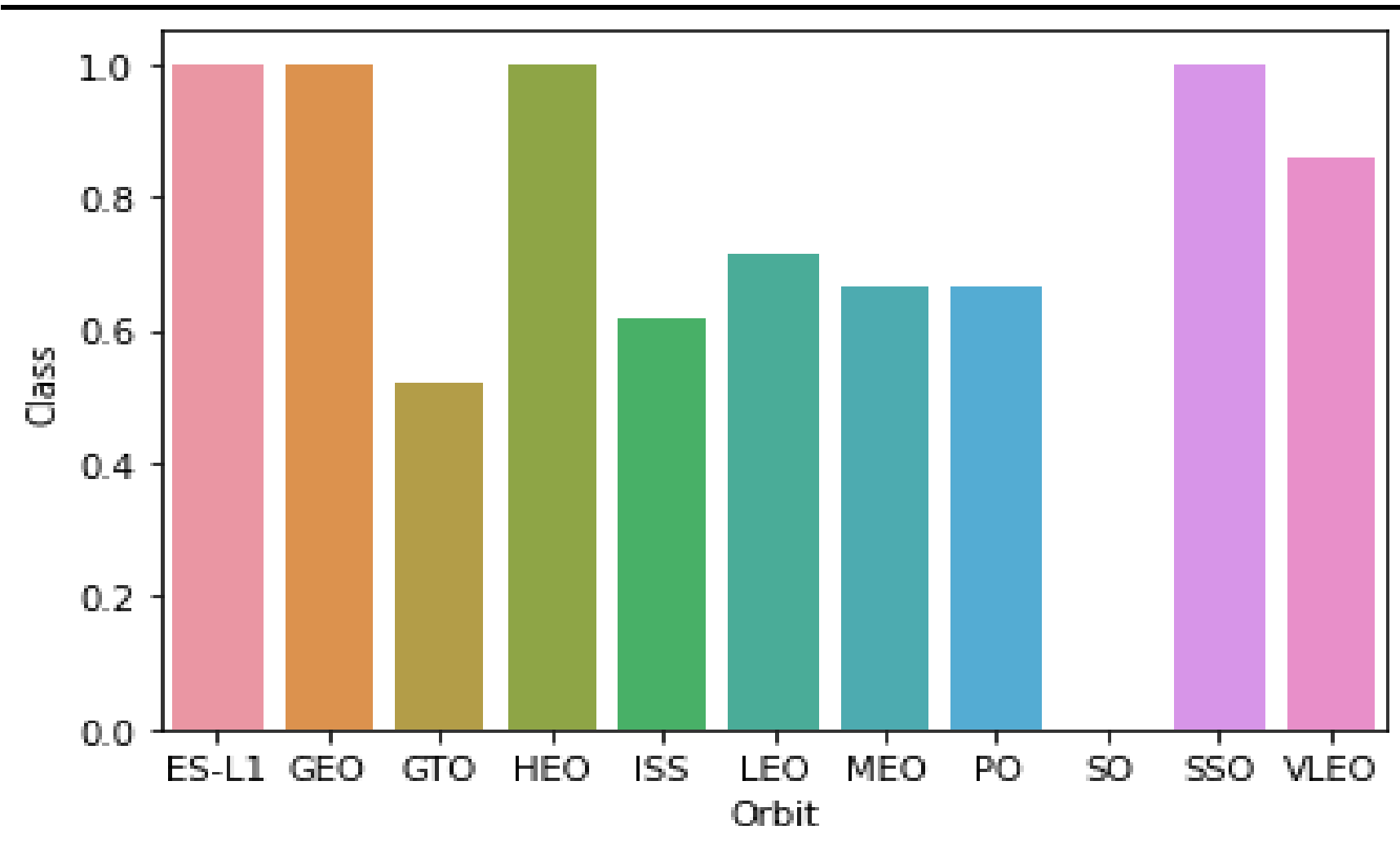
Especially, CCAFS-SLC 40 site is the most popular site than the other sites.

Payload vs. Launch Site



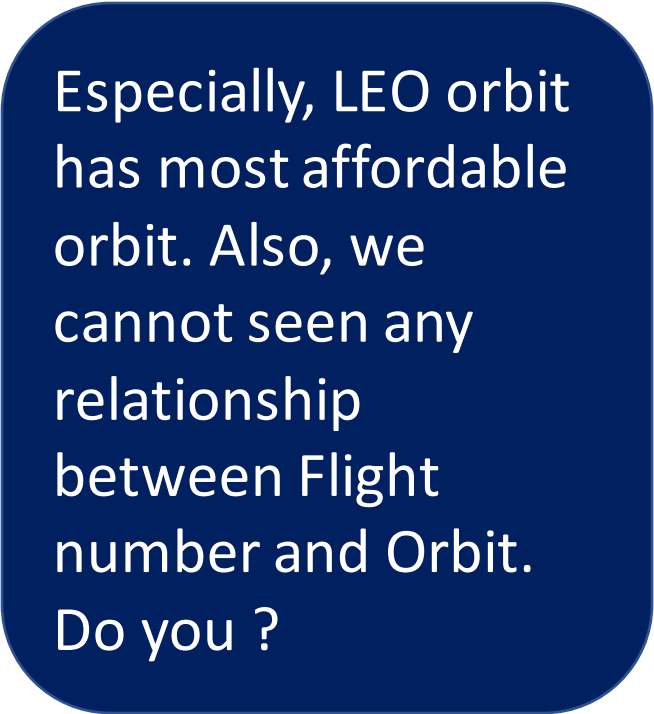
CCAFS-SLC 40 and KSC LC 39A are the most popular site than the other But they have low Pay Load Mass rate.

Success Rate vs. Orbit Type

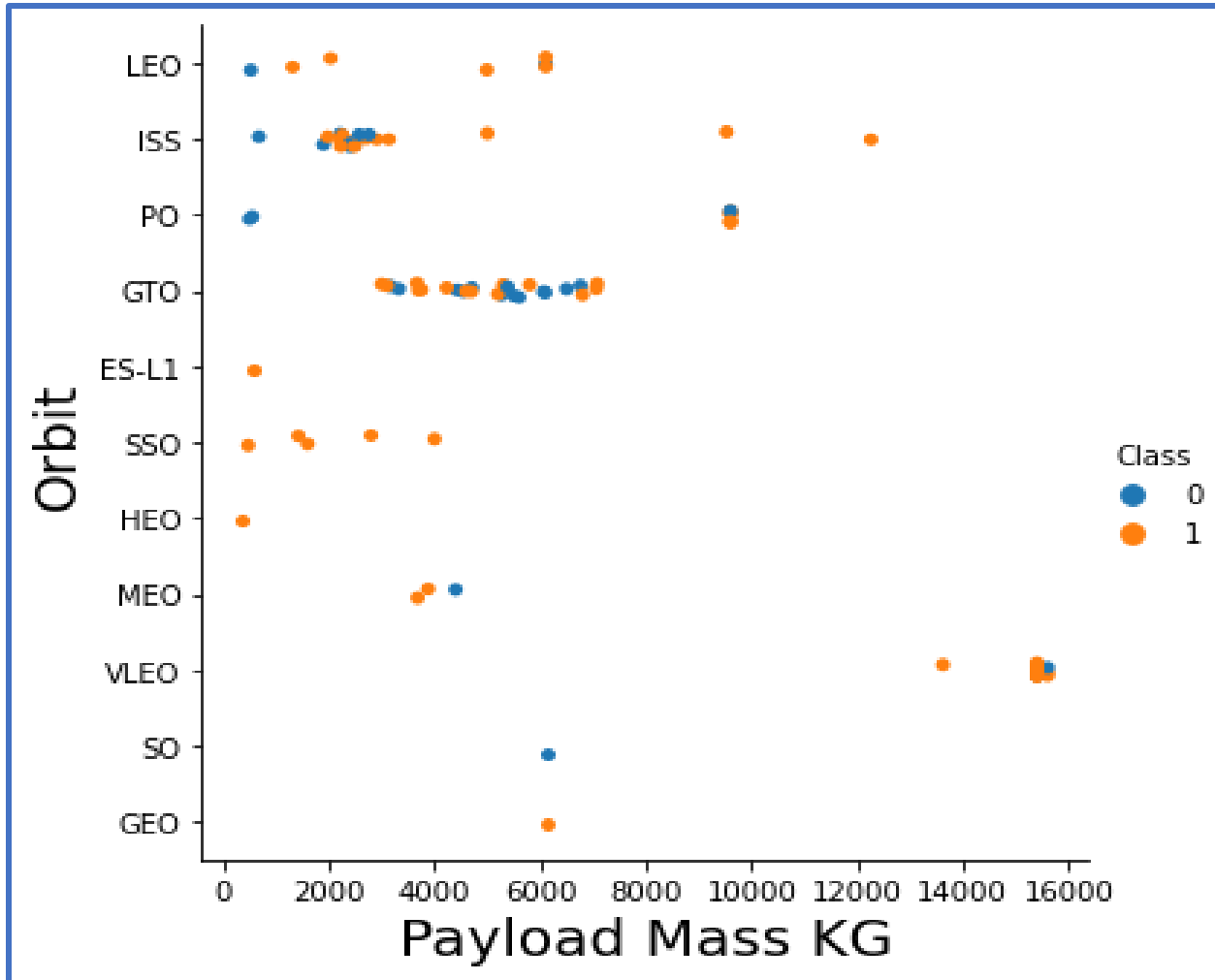


ES-L1, GEO, HEO and SSO have the best success rate than the others

GTO has lowest success rate

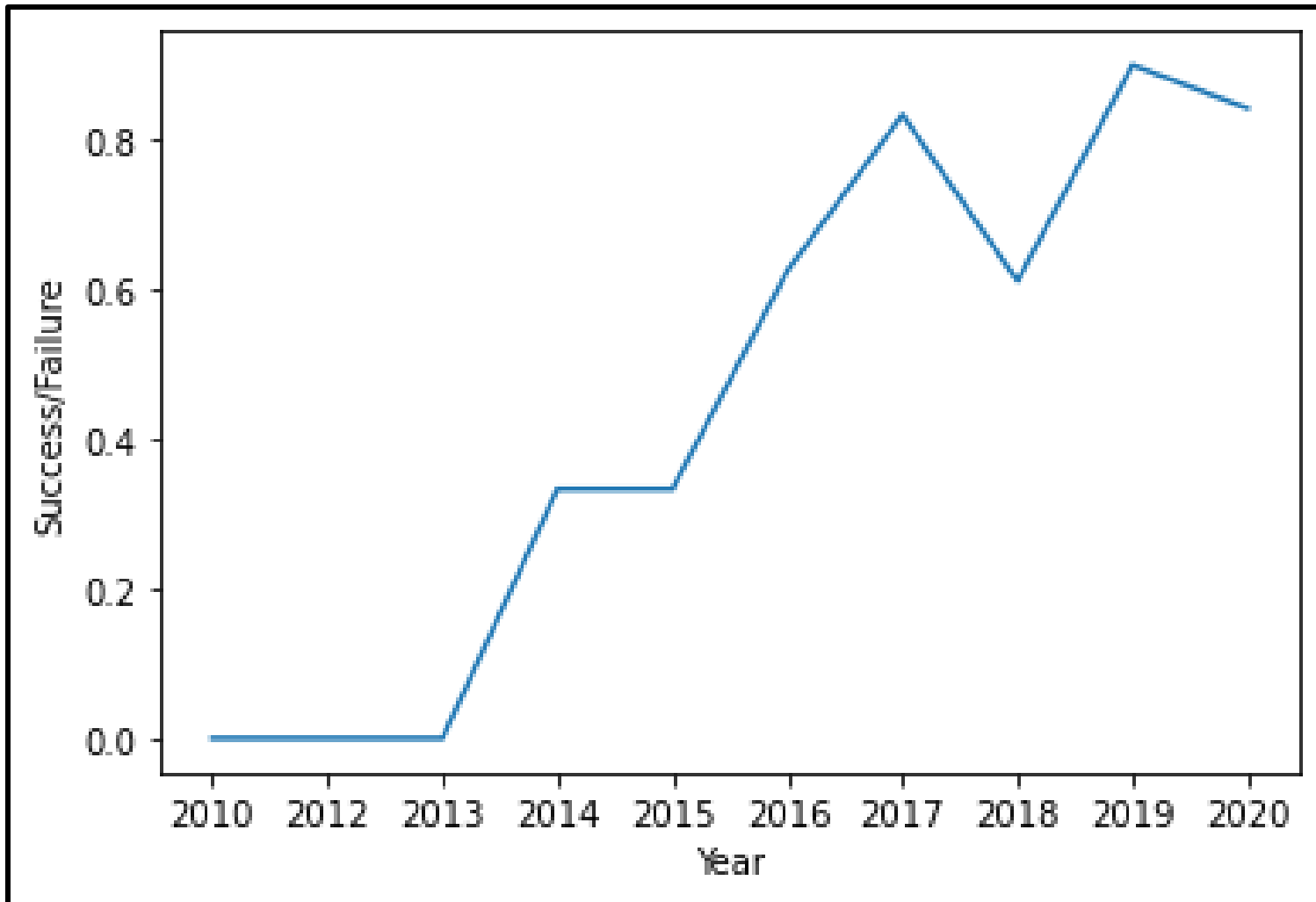


Payload vs. Orbit Type



GTO and ISS have heavy pay loads then the other orbit!

Launch Success Yearly Trend



Success rate started to increase in 2013 and kept skyrocketing till 2020. 2018 and 2019 are also not bad!

EDA with SQL



All Launch Site Names

Display the names of the unique launch sites in the space mission

In [5]: `%sql SELECT DISTINCT launch_site FROM SPACEXTBL`

Out[5]:

launch_site
CCAFS LC-40
CCAFS SLC-40
KSC LC-39A
VAFB SLC-4E

If we use DISTINCT keyword in SQL command to get unique site names.

Launch Site Names Begin with 'CCA'

Display 5 records where launch sites begin with the string 'CCA'

```
In [6]: %sql SELECT LAUNCH_SITE \
        FROM SPACEXTBL \
        WHERE LAUNCH_SITE LIKE 'CCA%' \
        LIMIT 5
```

```
Out[6]:
```

launch_site
CCAFS LC-40
CCAFS LC-40
CCAFS LC-40
CCAFS LC-40
CCAFS LC-40

If we use
LIKE keyword with
'CCA%' in SQL
command to get
site name starts
with "CCA".
Using LIMIT
5 keywords to get
top five records

Total Payload Mass

Display the total payload mass carried by boosters launched by NASA (CRS)

```
In [9]: %sql SELECT sum(PAYLOAD_MASS__KG_) AS "Total Payload Mass" FROM SPACEXTBL WHERE customer='NASA (CRS)'
```

Out[9]:

Total Payload Mass
45596

Selected only "NASA (CRS)" records to get Total Payload Mass with SUM() function;
Total Payload Mass is 45596

Average Payload Mass by F9 v1.1

Display average payload mass carried by booster version F9 v1.1

In [10]: `%sql SELECT avg(PAYLOAD_MASS_KG_) AS "Average Payload Mass" FROM SPACEXTBL WHERE booster_version='F9 v1.1'`

Out[10]:

Average Payload Mass
2928.400000

Selected only "F9 v1.1" records to get Average Payload Mass with AVG() function;
Total Payload Mass is 2928.4

First Successful Ground Landing Date

List the date when the first successful landing outcome in ground pad was acheived.

```
In [11]: %sql SELECT MIN(DATE) FROM SPACEXTBL WHERE mission_outcome='Success'
```

```
Out[11]:
```

1
2010-06-04

Selected only "Success" records to get first successful landing with MIN() function;
The date is 2010-06-04

Successful Drone Ship Landing with Payload between 4000 and 6000

List the names of the boosters which have success in drone ship and have payload mass greater than 4000 but less than 6000

```
In [12]: %sql SELECT * FROM SPACEXTBL \
        WHERE (payload_mass__kg_ > 4000 and payload_mass__kg_ < 6000) AND \
        landing__outcome='Success (drone ship)'
```

Out[12]:

DATE	time__utc_	booster_version	launch_site	payload	payload_mass__kg_	orbit	customer	mission_outcome	landing__outcome
2016-05-06	05:21:00	F9 FT B1022	CCAFS LC-40	JCSAT-14	4696	GTO	SKY Perfect JSAT Group	Success	Success (drone ship)
2016-08-14	05:26:00	F9 FT B1026	CCAFS LC-40	JCSAT-16	4600	GTO	SKY Perfect JSAT Group	Success	Success (drone ship)
2017-03-30	22:27:00	F9 FT B1021.2	KSC LC-39A	SES-10	5300	GTO	SES	Success	Success (drone ship)
2017-10-11	22:53:00	F9 FT B1031.2	KSC LC-39A	SES-11 / EchoStar 105	5200	GTO	SES EchoStar	Success	Success (drone ship)

Selected only "Success (drone ship)" records to get *payload mass greater than 4000 but less than 6000*;

Total Number of Successful and Failure Mission Outcomes

List the total number of successful and failure mission outcomes

```
In [13]: %sql SELECT COUNT(mission_outcome) AS Total_Success FROM SPACEXTBL WHERE mission_outcome LIKE '%Success%'
```

```
Out[13]:
```

total_success
100

Selected only "Success" records to get *Total Success mission with count()* function; Total Success is 100.

```
In [14]: %sql SELECT COUNT(mission_outcome) AS Total_Failure FROM SPACEXTBL WHERE mission_outcome LIKE '%Failure%'
```

```
Out[14]:
```

total_failure
1

Selected only "Failure" records with LIKE "%Failure" to get *Total Success mission with count()*; Total Failure is 1.

Boosters Carried Maximum Payload

List the names of the booster_versions which have carried the maximum payload mass. Use a subquery

```
In [16]: %sql SELECT BOOSTER_VERSION as boosterversion, PAYLOAD_MASS__KG_ from SPACEXTBL where PAYLOAD_MASS__KG_=(select max(PAYLOAD_MASS__KG_) from SPACEXTBL);
```

Out[16]:

boosterversion	payload_mass__kg_
F9 B5 B1048.4	15600
F9 B5 B1049.4	15600
F9 B5 B1051.3	15600
F9 B5 B1056.4	15600
F9 B5 B1048.5	15600
F9 B5 B1051.4	15600
F9 B5 B1049.5	15600
F9 B5 B1060.2	15600
F9 B5 B1058.3	15600
F9 B5 B1051.6	15600
F9 B5 B1060.3	15600
F9 B5 B1049.7	15600

Selected Boosters Carried with Maximum Payloads with sub query

2015 Launch Records

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

```
In [17]: %sql SELECT booster_version, launch_site, year(Date), mission_outcome, landing__outcome \
          FROM SPACEXTBL WHERE year(Date) = 2015 AND \
          landing__outcome='Failure (drone ship)'
```

```
Out[17]:
```

booster_version	launch_site	3	mission_outcome	landing__outcome
F9 v1.1 B1012	CCAFS LC-40	2015	Success	Failure (drone ship)
F9 v1.1 B1015	CCAFS LC-40	2015	Success	Failure (drone ship)

Selected only "Failure (drone ship)" in 2015 records to get booster version, launch site name

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

```
In [18]: %sql SELECT landing__outcome, DATE FROM SPACEXTBL WHERE DATE BETWEEN '2010-06-04' AND '2017-03-20' \
ORDER BY DATE DESC
```

Out[18]:

landing__outcome	DATE
No attempt	2017-03-16
Success (ground pad)	2017-02-19
Success (drone ship)	2017-01-14
Success (drone ship)	2016-08-14
Success (ground pad)	2016-07-18
Failure (drone ship)	2016-06-15
Success (drone ship)	2016-05-27
Success (drone ship)	2016-05-06
Success (drone ship)	2016-04-08
Failure (drone ship)	2016-03-04
Failure (drone ship)	2016-01-17
Success (ground pad)	2015-12-22
Precluded (drone ship)	2015-06-28

Selected Landing Outcomes between 2010-06-04 & 2017-03-20 to get from SpaceX dataset!

Launch Sites Proximities Analysis



Launch Sites Proximities Analysis

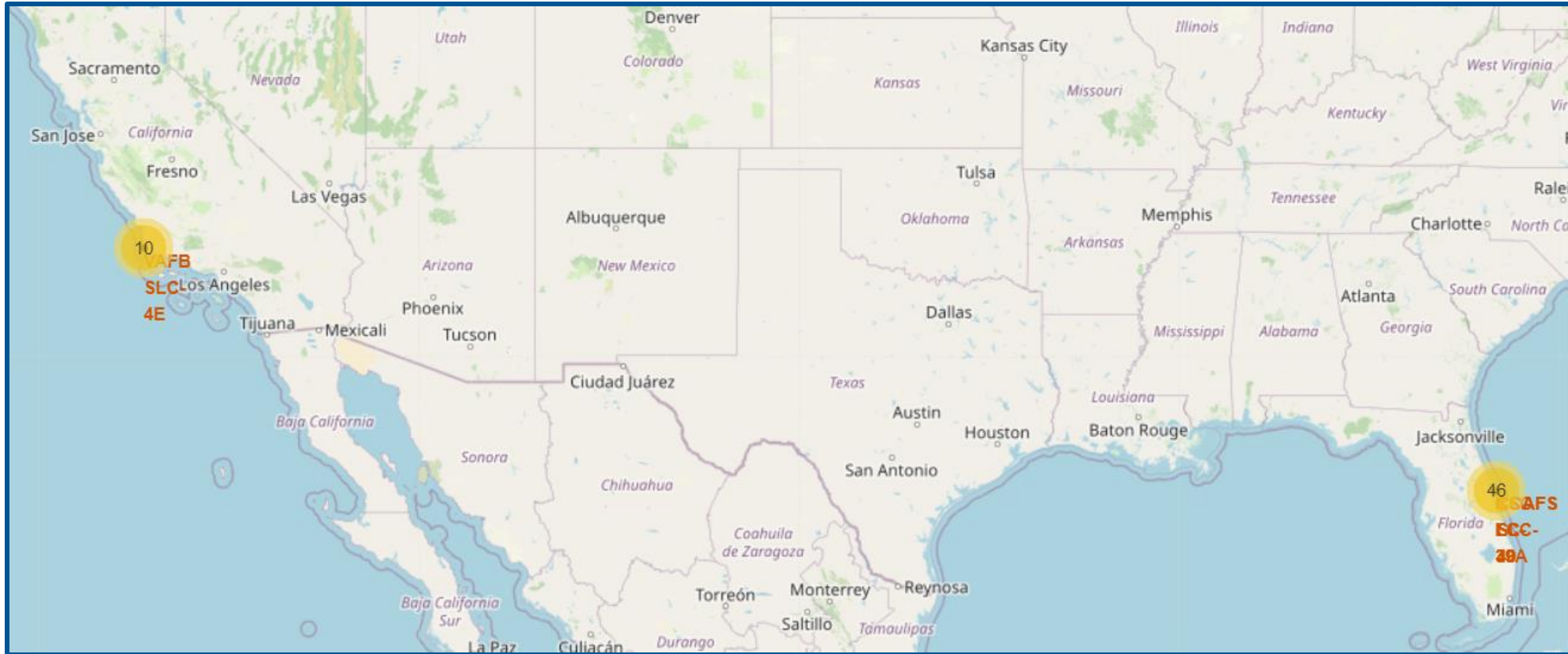
Folium Map Screenshot 1



SpaceX Launch site is located in East and west cost of United States
Florida, California

Launch Sites Proximities Analysis

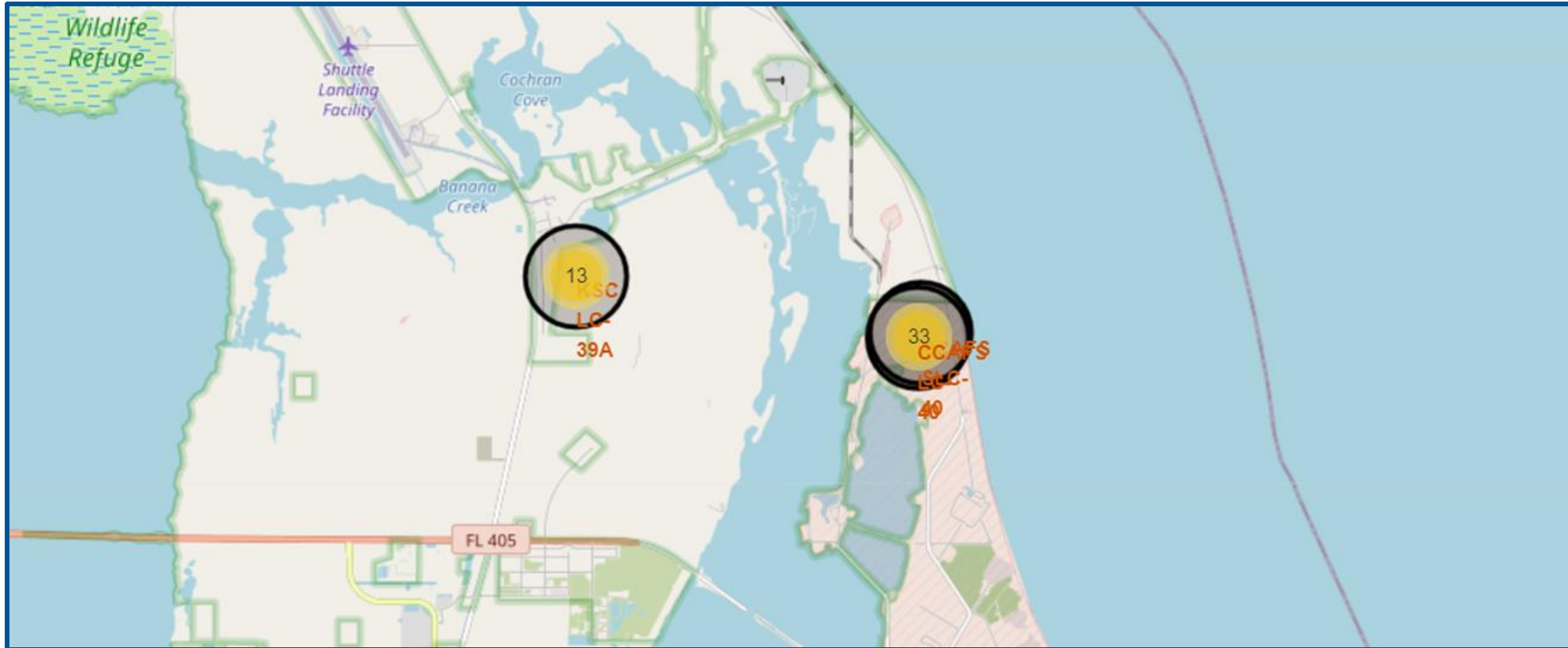
Folium Map Screenshot 2



Map shows number of the success launches per each location.

Launch Sites Proximities Analysis

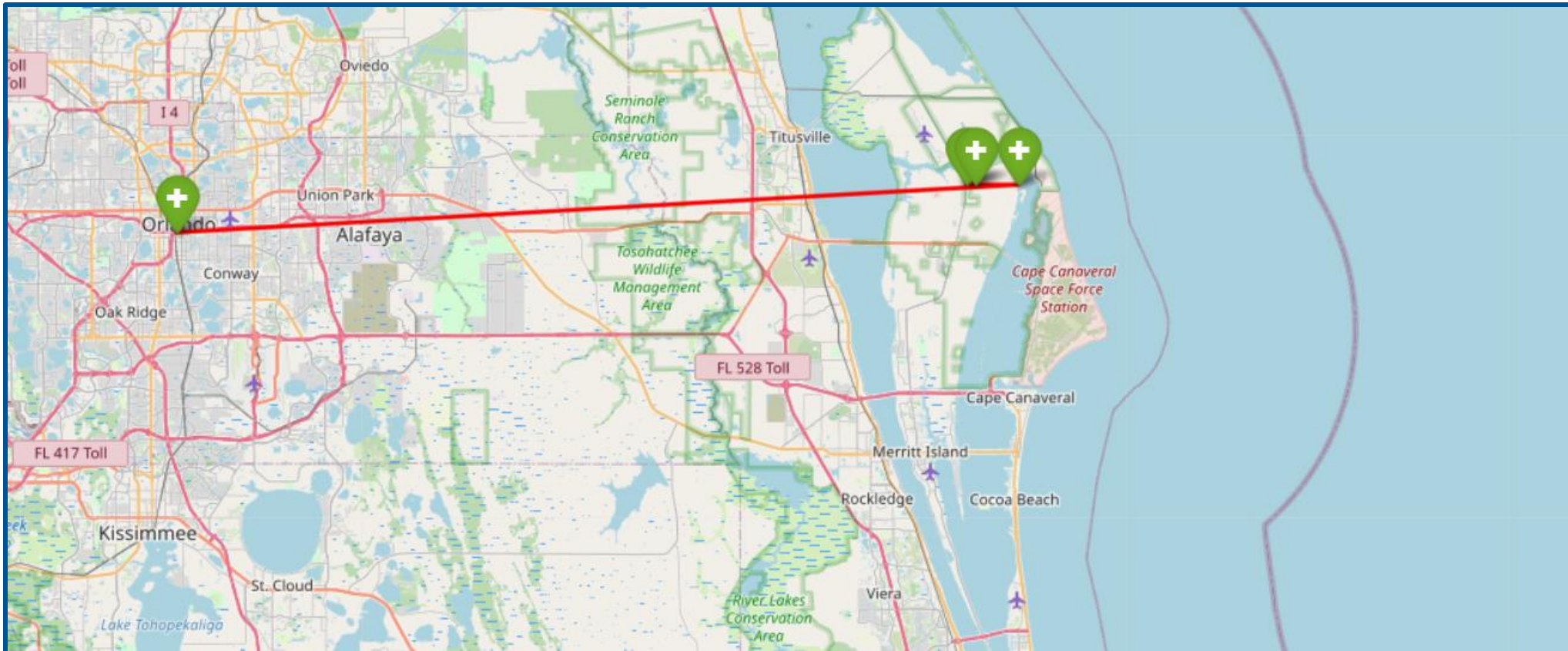
Folium Map Screenshot 3



Map shows number of the success launches per each location for Florida

Launch Sites Proximities Analysis

Folium Map Screenshot 4



The map shows with red lines the proximity points of interest in Florida City.

Dashboard with Plotly Dash



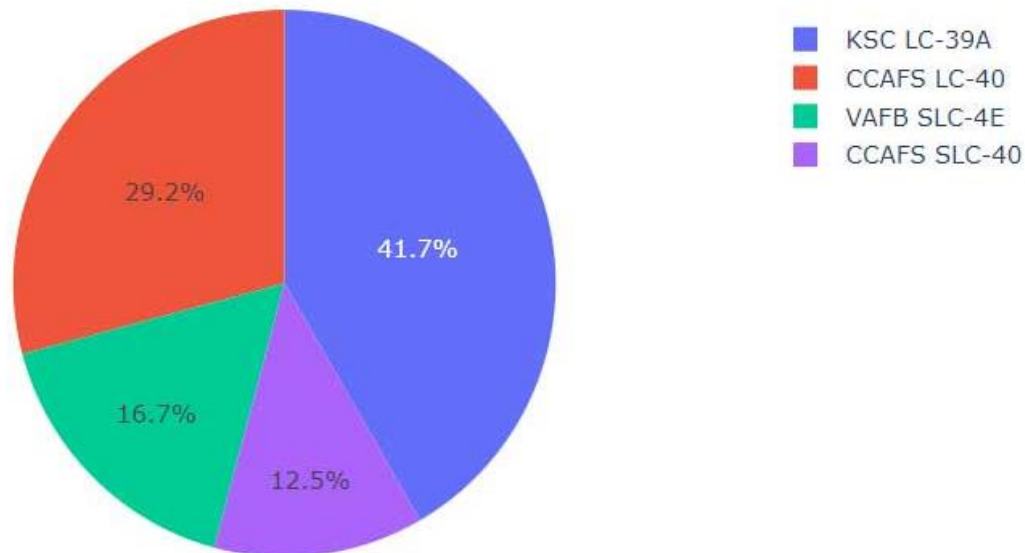
SpaceX Launch Record Dashboard

Screenshot 1.

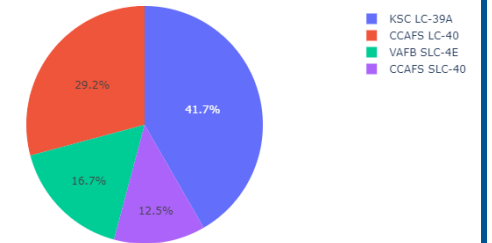
SpaceX Launch Records Dashboard

All Sites

Success Count for all launch sites



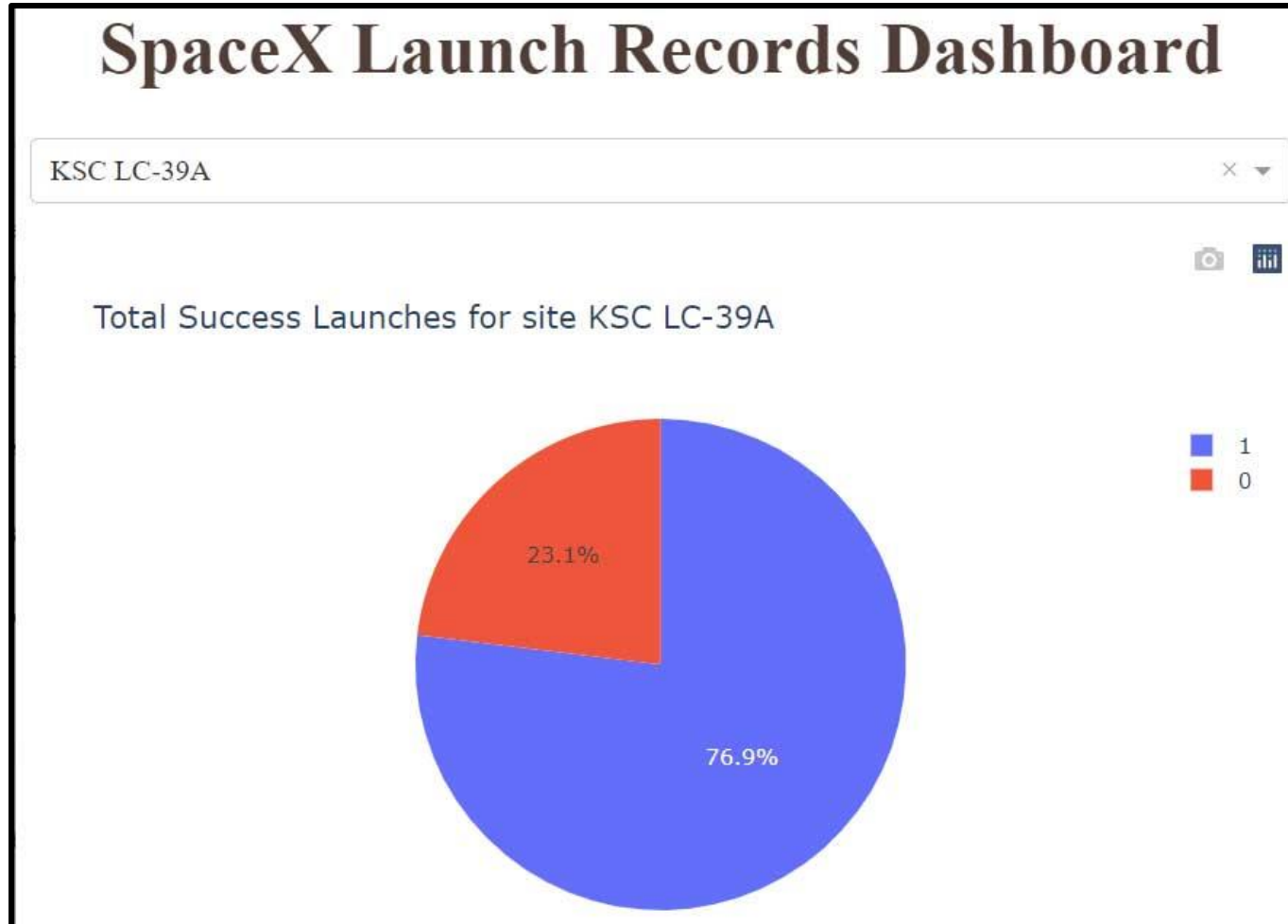
Success Count for all launch sites



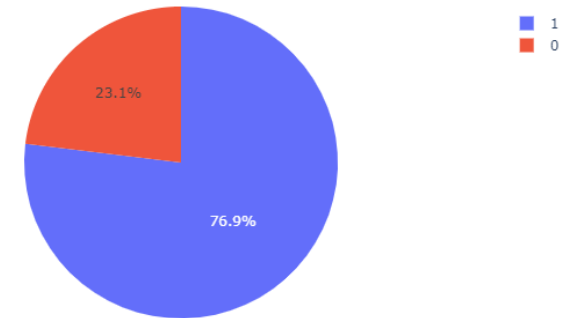
KSC LC-39A has the most successful launches than the other site than CCAFS LC-40, VAF8 SLC-4E and CCAFS SLC-40

SpaceX Launch Record Dashboard

Screenshot 2.



Total Success Launches for site KSC LC-39A



KSC LC-39A has the highest successful rate

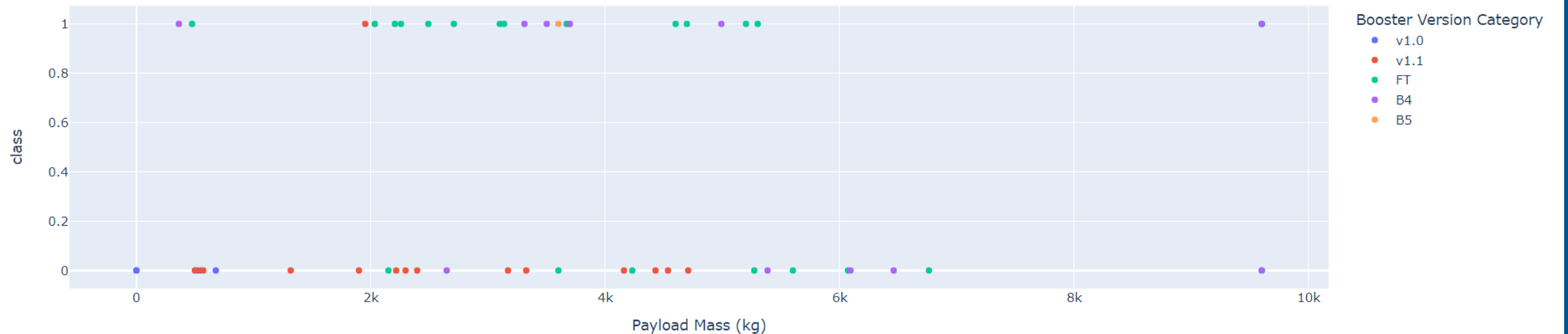
SpaceX Launch Record Dashboard

Screenshot 3.1 same payloads with Full range slider

Payload range (Kg):



Success count on Payload mass for all sites

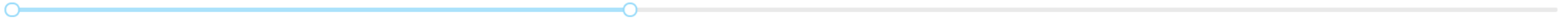


Booster Version Category v1.0 and v1.1 have highest success rate than the others

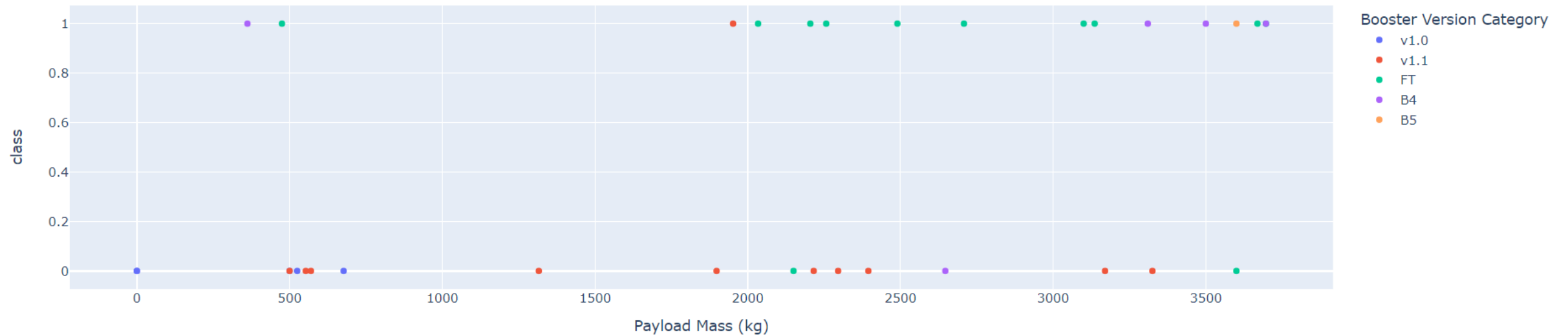
SpaceX Launch Record Dashboard

Screenshot 3.2 with different payload selected in the range slider

Payload range (Kg):



Success count on Payload mass for all sites



Booster Version Category v1.0 and v1.1 have highest success rate than the others

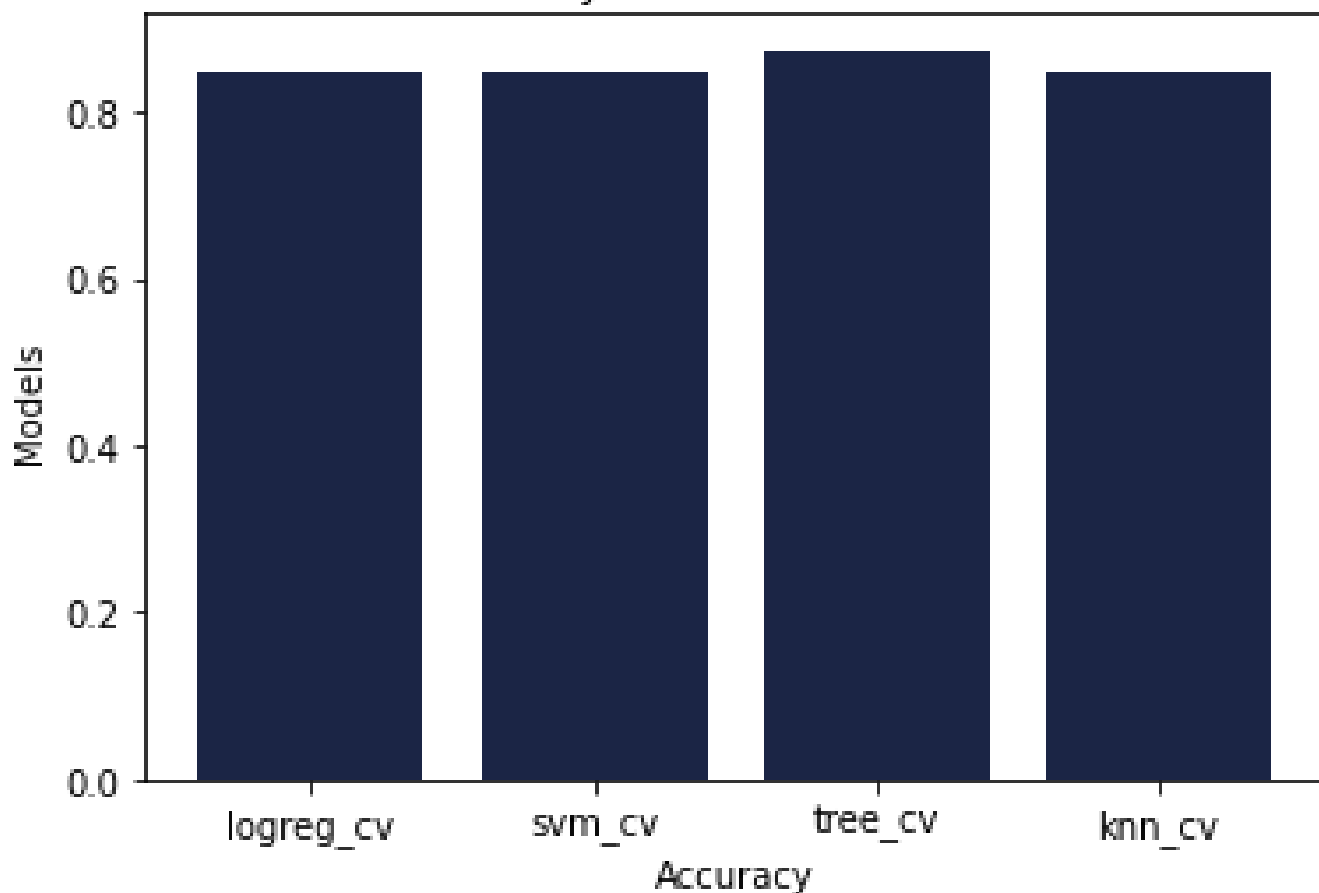
Predictive Analysis (Classification)

Section 5



Classification Accuracy

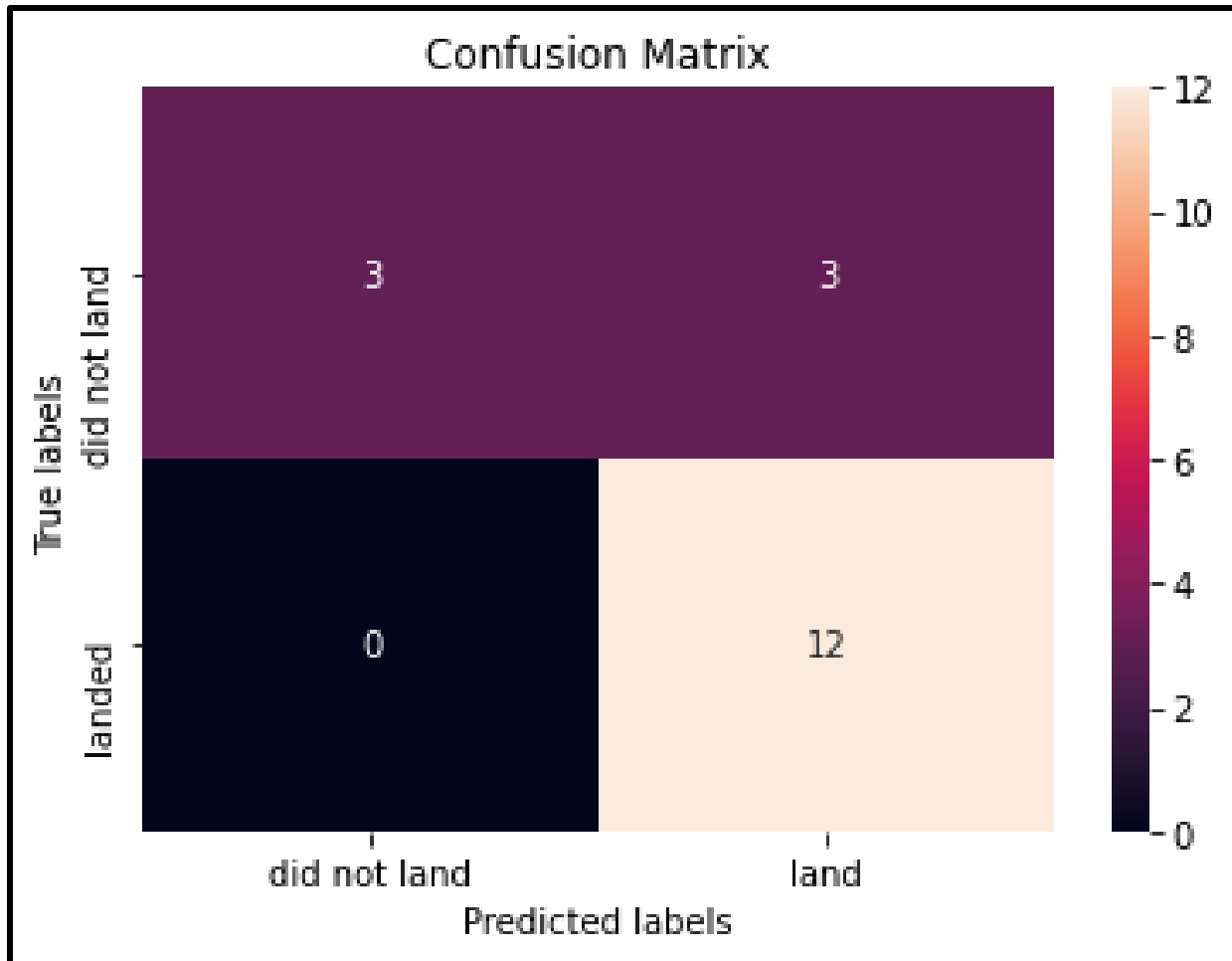
Model Accuracy for all classification models



```
▶ scores  
[104] ✓ 0.2s  
... {'logreg_cv': 0.8464285714285713,  
      'svm_cv': 0.8482142857142856,  
      'tree_cv': 0.8732142857142857,  
      'knn_cv': 0.8482142857142858}
```

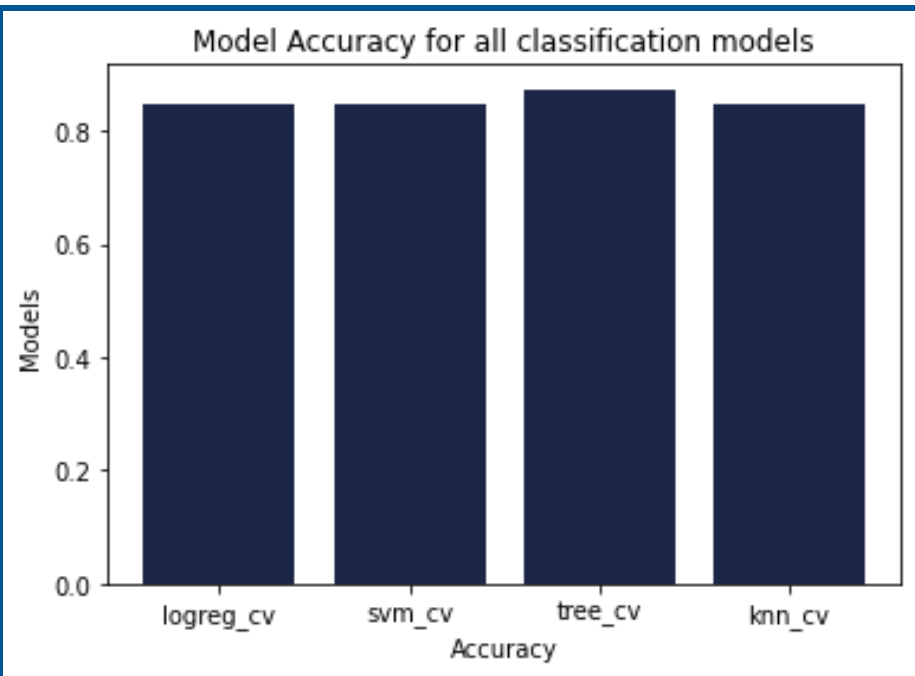
Decision Tree Classifier is the highest score 0.87 accuracy

Confusion Matrix



The Confusion Matrix for the Decision Tree model

Conclusions



Tree Classifier Algorithm the best score 0.87 for the Machine Learning

Orbit ES-LI, GEO, HEO and SSO have the best success rate than the others GTO has lowest success rate

CCAFS-SLC 40 and KSC LC 39A are the most popular site than the other But they have low Pay Load Mass rate.

Success rate started to increase in 2013 and kept skyrocketing till 2020. 2018 and 2019 are also not bad!

Thank you

