



IBM Developer
SKILLS NETWORK

Winning Space Race with Data Science

<Panagiotis Karaoulanis>
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Outline

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

Executive Summary

- Summary of methodologies
- Summary of all results

Introduction

- Project background and context
- Problems you want to find answers

Section 1

Methodology

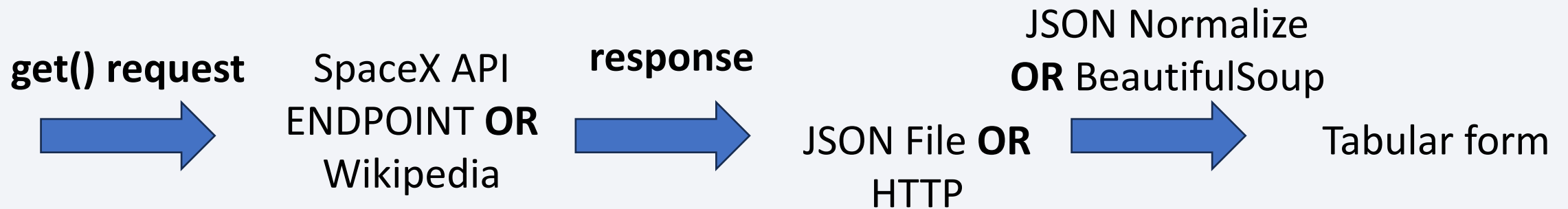
Methodology

Executive Summary

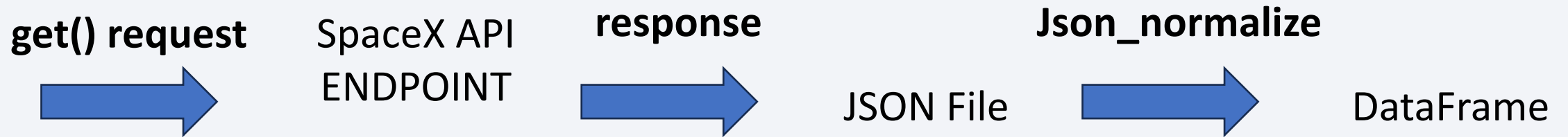
- Data collection methodology:
- Perform data wrangling
- Perform exploratory data analysis (EDA) using visualization and SQL
- Perform interactive visual analytics using Folium and Plotly Dash
- Perform predictive analysis using classification models
 - How to build, tune, evaluate classification models

Data Collection

- The primary method for collecting the data is through the SpaceX REST API
- Web scraping, from Wikipedia pages or similar sources that list Falcon 9 launches



Data Collection – SpaceX API



- <https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/0c064fc9b81b2ecae69775573a4b66641d09976f/jupyter-labs-spacex-data-collection-api.ipynb>

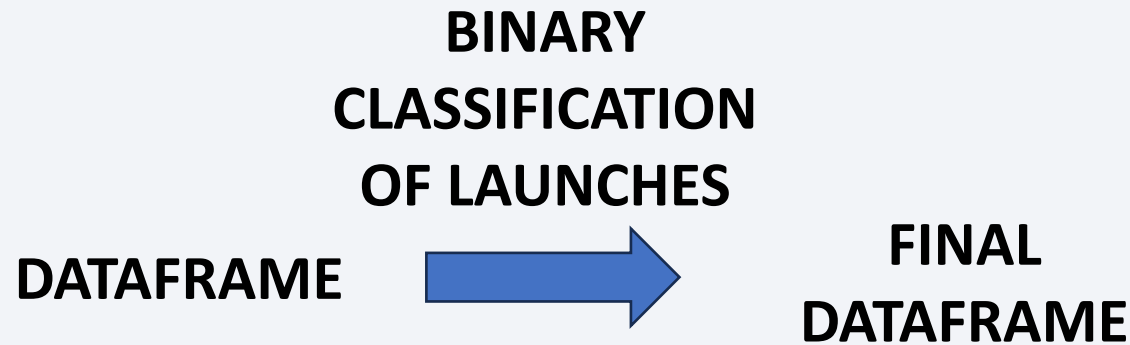
Data Collection - Scraping



- [https://github.com/PanosKar
aoulanis/DATA-ANALYSIS-
CAPSTONE/blob/Oc064fc9b
81b2ecae69775573a4b666
41d09976f/jupyter-labs-
webscraping.ipynb](https://github.com/PanosKar
aoulanis/DATA-ANALYSIS-
CAPSTONE/blob/Oc064fc9b
81b2ecae69775573a4b666
41d09976f/jupyter-labs-
webscraping.ipynb)

Data Wrangling

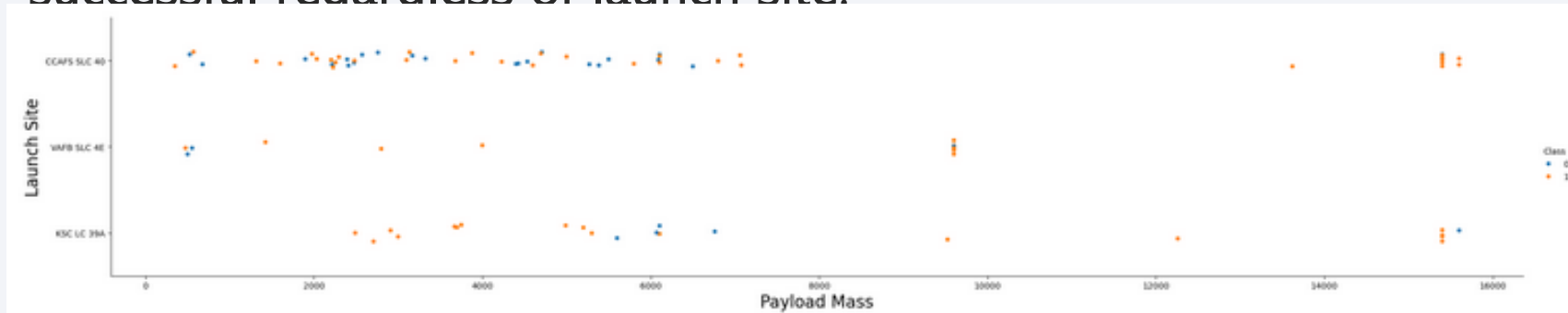
- Creating a column in the dataframe to easily account for successful launches



- <https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/0c064fc9b81b2ecae69775573a4b66641d09976f/labs-jupyter-spacex-Data%20wrangling.ipynb>

EDA with Data Visualization

- Scatter plots were used to visually determine the correlation (if any) between variables and to draw any conclusions regarding the relationships of the data features. For example when plotting launch site vs. Payload Mass we can easily conclude that after a certain weight the results tend to be more successful regardless of launch site.



- A bar plot was used to plot data that had a categorical value and a line chart was used to present data on a temporal axis
- <https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/Oc064fc9b81b2ecae69775573a4b66641d09976f/edadataviz.ipynb>

EDA with SQL

- Using bullet point format, summarize the SQL queries you performed
 - Query to create the table to work on
 - Query to display the names of the unique launch sites in the space mission
 - Query to display the average payload mass carried by booster version F9 v1.1
 - Query to list the total number of successful and failure mission outcomes
 - Query to List the records which will display the month names, failure landing_outcomes in drone ship ,booster versions, launch_site for the months in year 2015.
- https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/Oc064fc9b81b2ecae69775573a4b66641d09976f/jupyter-labs-eda-sql-coursera_sqlite.ipynb

Build an Interactive Map with Folium

- Summarize what map objects such as markers, circles, lines, etc. you created and added to a folium map
 - `folium.Circle` and `folium.map.marker` were used to add a highlighted circle area with a text label on a specific coordinate such as the coordinates of NASA or other launch sites. Using these objects can help the user identify the launch site and points of interest in a map. We could use these objects to show the number of successful launches in each site.
 - Lines were used to visually portray the distances between 2 points on the map. For example, the distance between a launch site and a highway or the coastline
- [https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/145a5ca567a8642a3ac6121b84bc50900a7f5239/lab_jupyter_launch_site_location\(2\).ipynb](https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/145a5ca567a8642a3ac6121b84bc50900a7f5239/lab_jupyter_launch_site_location(2).ipynb)

Build a Dashboard with Plotly Dash

- Two elements controlled by the user were added:
 - Choosing launch site from a dropdown menu
 - Selecting payload mass range with a slider set from 0 to 10000 kg
- Two graphs were selected:
 - A **pie** chart that would display the success percentage attributed to each launch site (if in the dropdown menu the user selected “ALL”) or the success rate in each launch site (if in the dropdown menu the user selected a specific launch site)
 - A scatter plot that would show the relationship between success and weight of the payload (either universally or for a given launch site)
- https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/Oc064fc9b81b2ecae69775573a4b66641d09976f/spacex_dash_app.py

Predictive Analysis (Classification)

1. Create a numpy array for the dependent variable which takes on values that indicate a success or failure **and** a dataframe holding the independent variables
 2. Standardize the variables in the dataframe in order to perform predictive analysis
 3. Split the data into test and train data
 4. Train different models and use gridsearch algorithm to find best parameters for each model
 5. Use a confusion matrix to quickly visualize the accuracy of the model
 6. Calculate accuracy for each model given best parameters and choose the most accurate one
- [https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/Oc064fc9b81b2ecae69775573a4b66641d09976f/SpaceX_Machine%20Learning%20Prediction_Part_5\(1\).ipynb](https://github.com/PanosKaraoulanis/DATA-ANALYSIS-CAPSTONE/blob/Oc064fc9b81b2ecae69775573a4b66641d09976f/SpaceX_Machine%20Learning%20Prediction_Part_5(1).ipynb)

Results

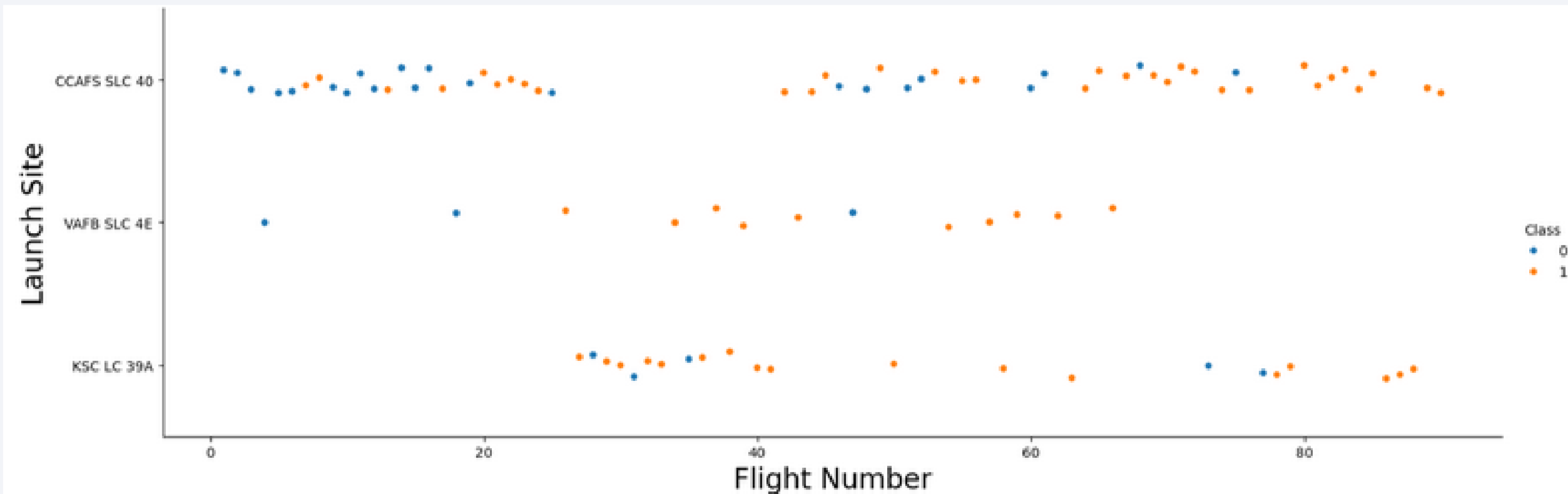
- Exploratory data analysis results
- Interactive analytics demo in screenshots
- Predictive analysis results

The background of the slide is an abstract composition. It features a dark blue base color. Overlaid on this are numerous diagonal streaks in shades of red and cyan. A faint, light blue grid pattern is also visible, particularly in the lower-left quadrant. The overall effect is dynamic and technological.

Section 2

Insights drawn from EDA

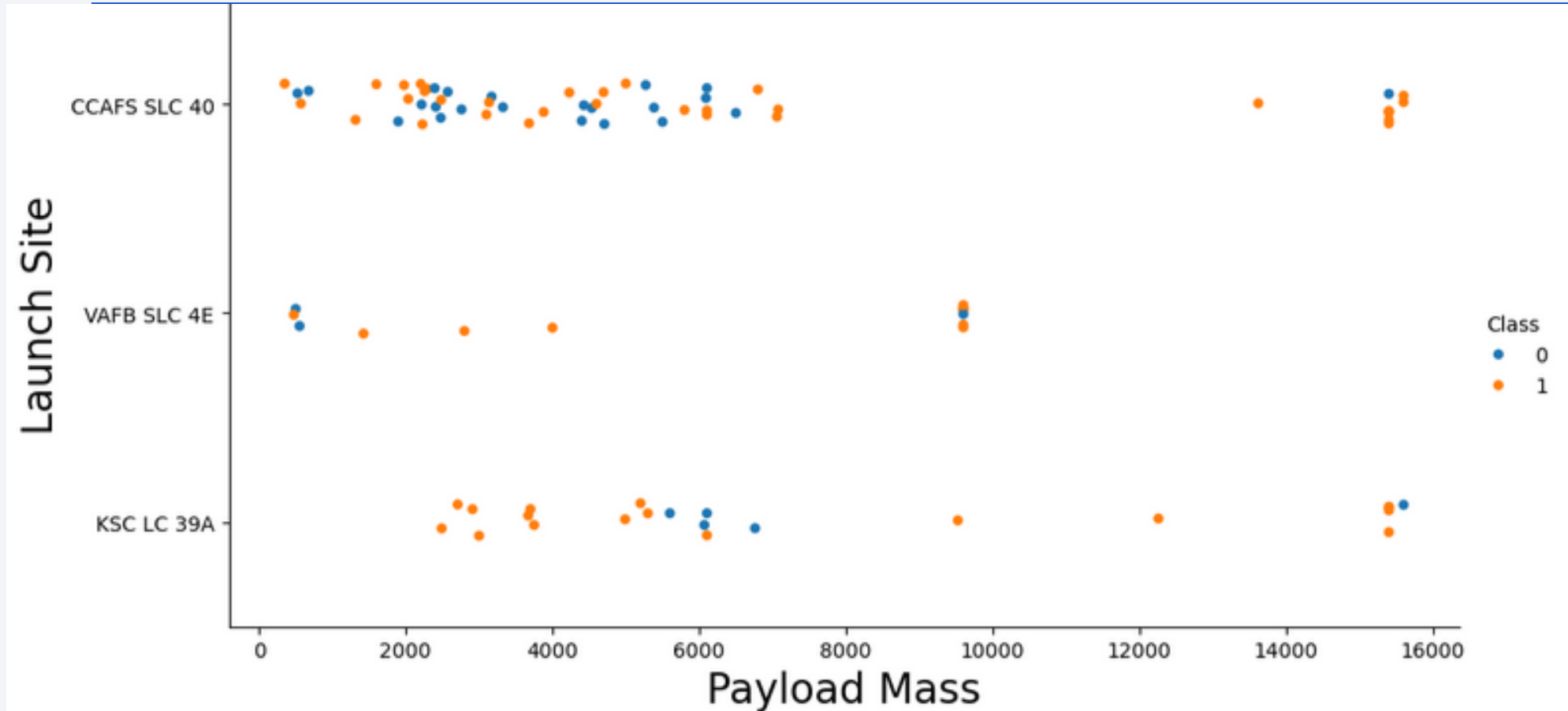
Flight Number vs. Launch Site



Explanation:

As flight number increases successes outnumber failures indiscriminately of location

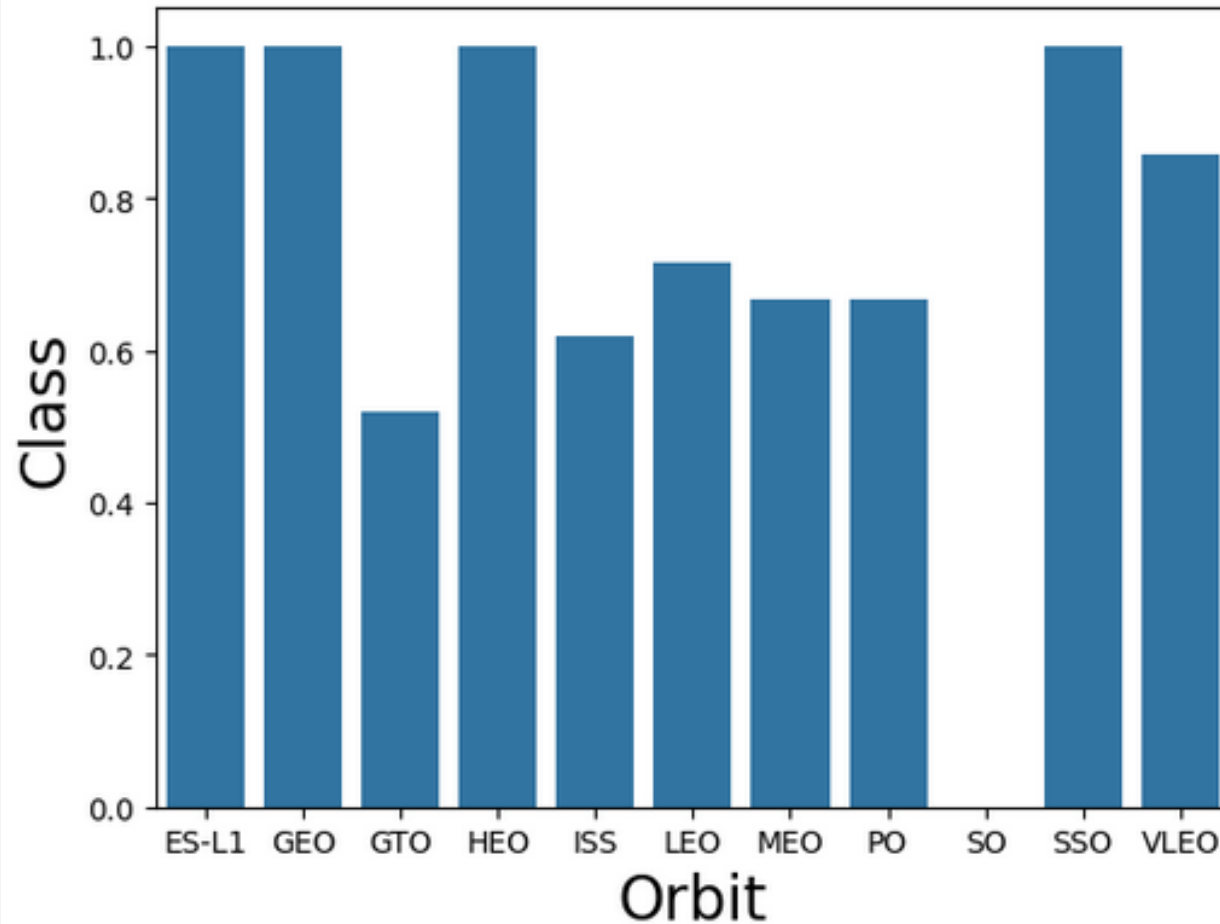
Payload vs. Launch Site



As payload mass increases successes outnumber failures indiscriminately of location

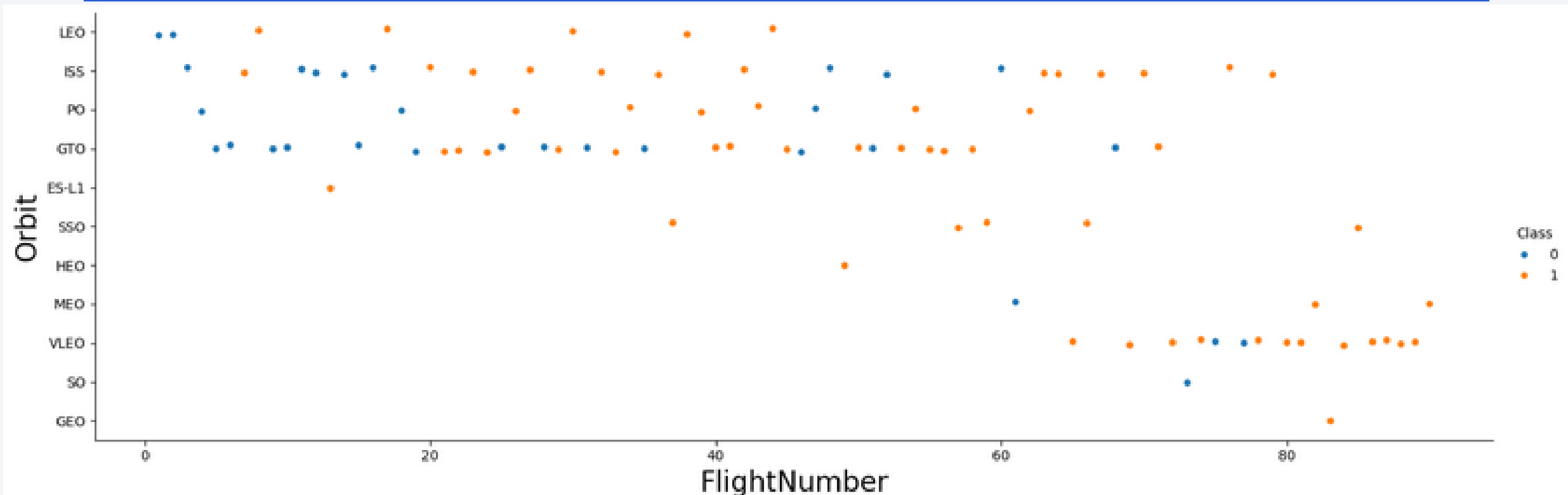
For the VAFB-SLC launchsite there are no rockets launched for heavy payload mass (greater than 10000)

Success Rate vs. Orbit Type



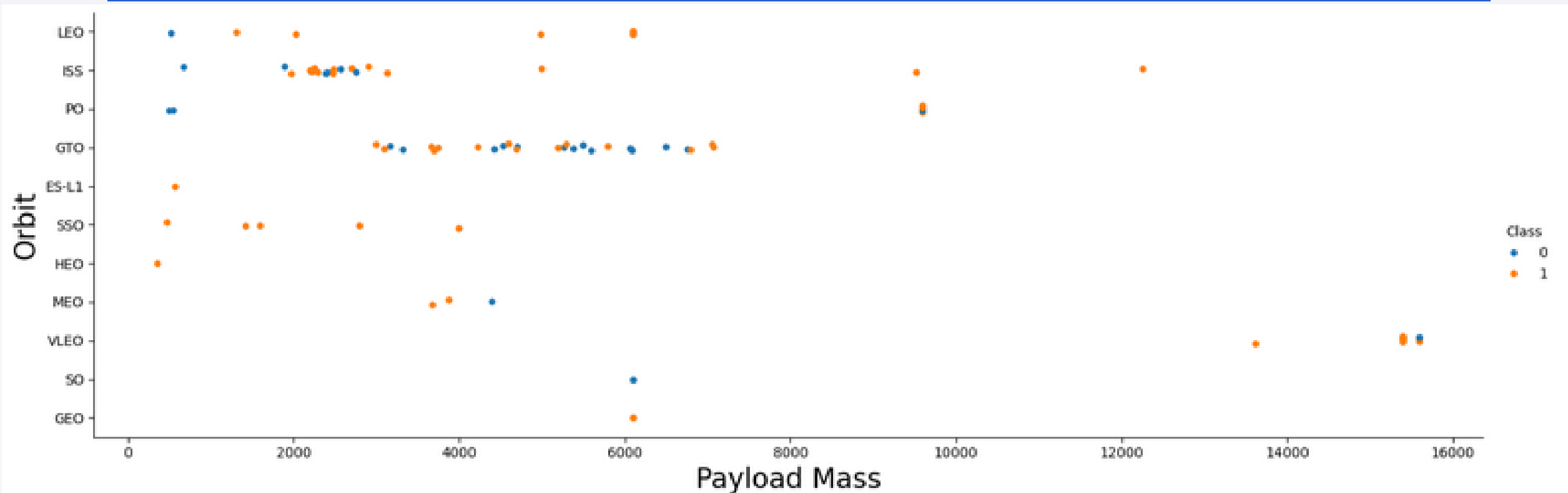
- ES-L1, GEO, HEO, SSO appear to be the orbits with the highest success rates

Flight Number vs. Orbit Type



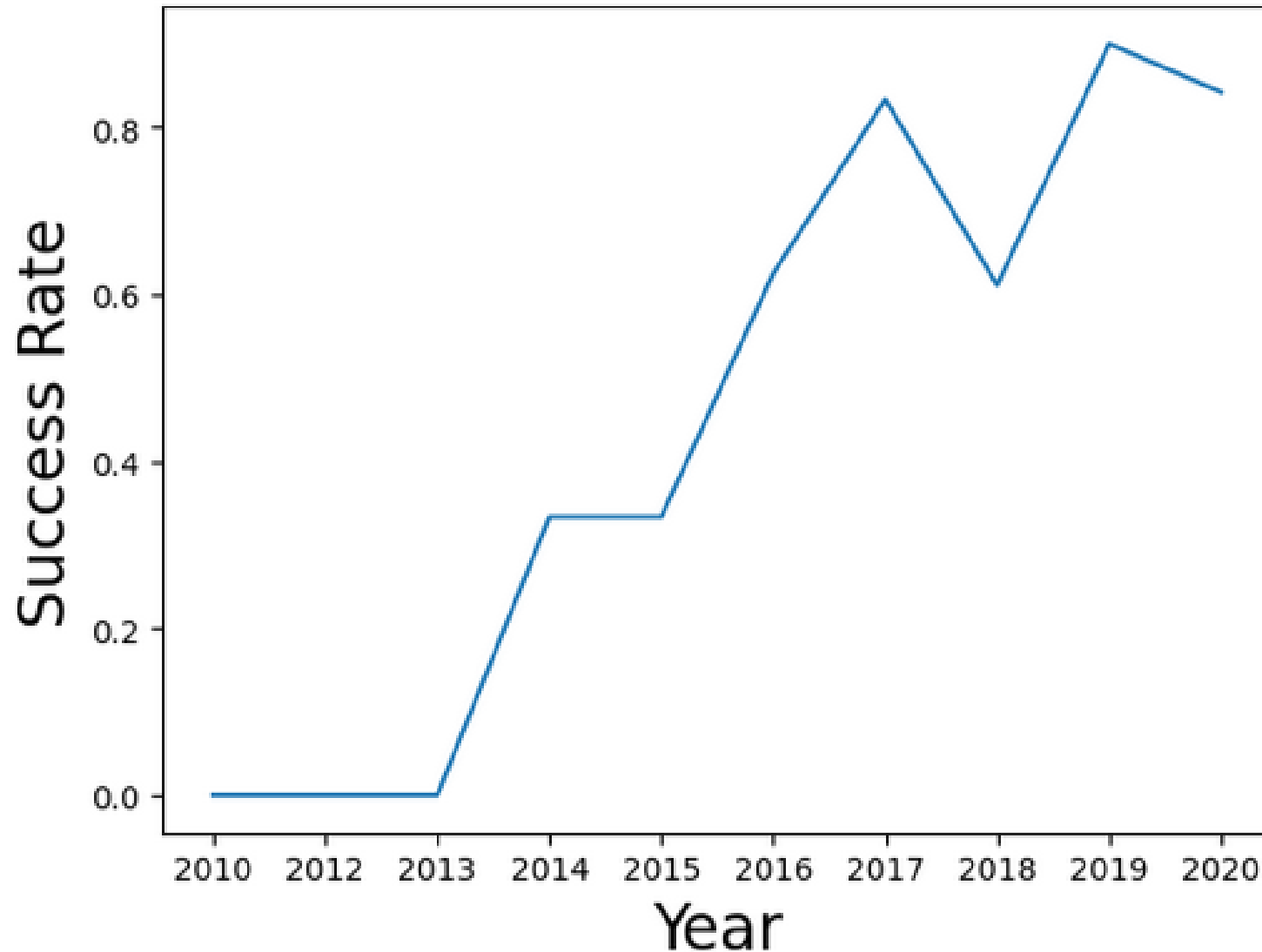
- GTO orbit appears to have lower success rate despite increasing Flight number which seems to be positively correlated to success of launch

Payload vs. Orbit Type



- GTO orbit presents mixed results concerning payload mass and success rate
- ISS orbit exhibits high success when handling lighter loads

Launch Success Yearly Trend



- There is noticeable growth in the success rate of launches as time passes

All Launch Site Names

Launch_Site

CCAFS LC-40

VAFB SLC-4E

KSC LC-39A

CCAFS SLC-40

QUERY USED IN SQL:

```
%sql select distinct "Launch_Site" from SPACEXTABLE
```

USED TO GET
UNIQUE
ROW
ELEMENTS
FROM THE
COLUMN

COLUMN
NAME

TABLE
NAME

Launch Site Names Begin with 'CCA'

Date	Time (UTC)	Booster_Version	Launch_Site	Payload	PAYLOAD_MASS_KG_	Orbit	Customer	Mission_Outcome
2010-06-04	18:45:00	F9 v1.0 B0003	CCAFS LC-40	Dragon Spacecraft Qualification Unit	0	LEO	SpaceX	Success
2010-12-08	15:43:00	F9 v1.0 B0004	CCAFS LC-40	Dragon demo flight C1, two CubeSats, barrel of Brouere cheese	0	LEO (ISS)	NASA (COTS) NRO	Success
2012-05-22	7:44:00	F9 v1.0 B0005	CCAFS LC-40	Dragon demo flight C2	525	LEO (ISS)	NASA (COTS)	Success
2012-10-08	0:35:00	F9 v1.0 B0006	CCAFS LC-40	SpaceX CRS-1	500	LEO (ISS)	NASA (CRS)	Success
2013-03-01	15:10:00	F9 v1.0 B0007	CCAFS LC-40	SpaceX CRS-2	677	LEO (ISS)	NASA (CRS)	Success

QUERY USED IN SQL:

%%sql

```
select * from SPACEXTABLE  
where "Launch_Site" like "CCA%"  
limit 5
```

RETURN
EVERY
COLUMN
FROM TABLE

LIMITING
SEARCH
QUERY TO 5
RESULTS

FILTERING THE
RESULTS USING
THE SIMILARITY
CLAUSE "LIKE"

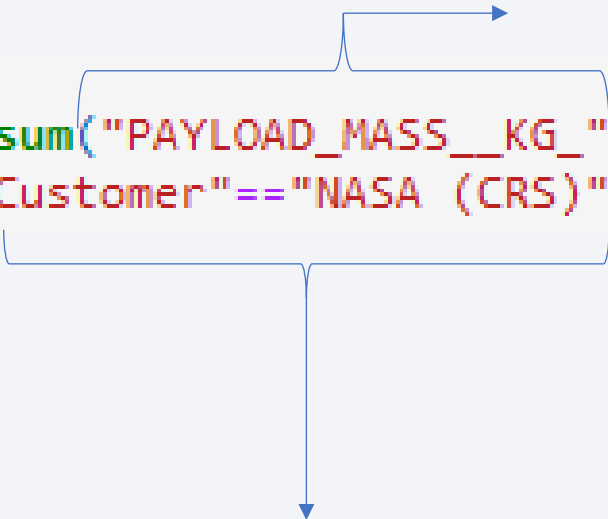
Total Payload Mass

```
sum("PAYLOAD_MASS_KG_")
```

45596

QUERY USED IN SQL:

```
%%sql  
select sum("PAYLOAD_MASS_KG_") from SPACEXTABLE  
where "Customer"=="NASA (CRS)"
```



RETURN THE SUM OF
ELEMENTS FROM
CHOSEN COLUMN

FILTERING THE
RESULTS USING A
BOOLEAN
OPERATOR

Average Payload Mass by F9 v1.1

```
sum("PAYLOAD_MASS_KG_")/count(PAYLOAD_MASS_KG_)
2928
```

QUERY USED IN SQL:

**RETURN THE AVERAGE
OF ELEMENTS FROM
CHOSEN COLUMN**

```
%%sql
select sum("PAYLOAD_MASS_KG_")/count(PAYLOAD_MASS_KG_) from SPACEXTABLE
where "Booster_Version"=="F9 v1.1"
```

**FILTERING THE
RESULTS USING A
BOOLEAN
OPERATOR**

First Successful Ground Landing Date

Date	Landing_Outcome
2015-12-22	Success (ground pad)

QUERY USED IN SQL:

RETURN 2 COLUMNS
FROM TABLE

```
%%sql  
select "Date","Landing_Outcome" from SPACEXTABLE  
where "Landing_Outcome"=="Success (ground pad)"  
order by "Date" asc  
limit 1
```

FILTER RESULTS USING A BOOLEAN OPERATOR ON
DESIRED COLUMN

RETURN RESULTS IN
ASCENDING ORDER

RETURN 1ST RESULT

Successful Drone Ship Landing with Payload between 4000 and 6000

QUERY USED IN SQL:

Booster_Version

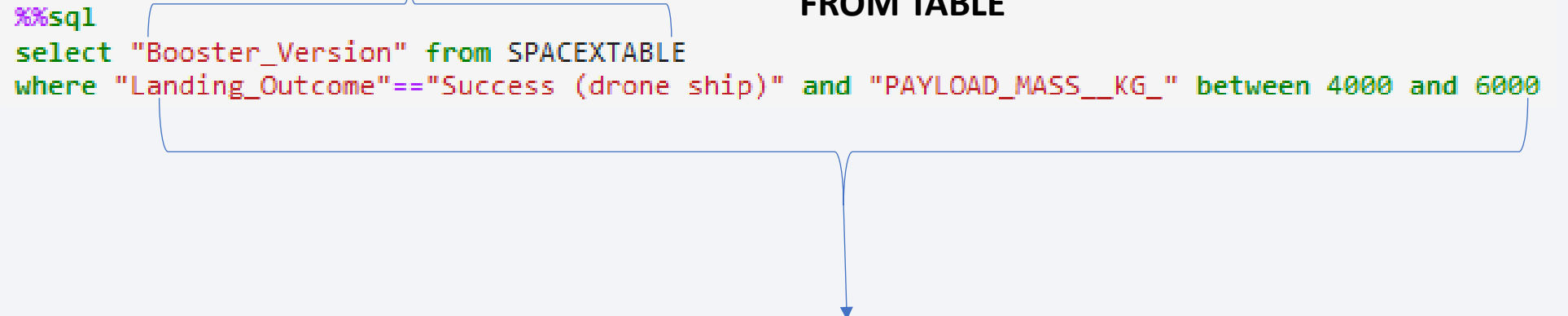
F9 FT B1022

F9 FT B1026

F9 FT B1021.2

F9 FT B1031.2

```
%%sql  
select "Booster_Version" from SPACEXTABLE  
where "Landing_Outcome"=="Success (drone ship)" and "PAYLOAD_MASS_KG_" between 4000 and 6000
```



**RETURN 1 COLUMN
FROM TABLE**

**FILTER RESULTS USING A BOOLEAN OPERATOR AND THE BETWEEN-AND OPERATOR TO
FILTER RESULTS BASED ON NUMERICAL VALUES**

Total Number of Successful and Failure Mission Outcomes

Mission_Outcome	count("Mission_Outcome")
Failure (in flight)	1
Success	98
Success	1
Success (payload status unclear)	1

QUERY USED IN SQL:

RETURN THE COLUMN FROM
TABLE AND THE COUNT FOR
EACH DISTINCT VALUE

```
%%sql  
select "Mission_Outcome",count("Mission_Outcome") from SPACEXTABLE  
group by "Mission Outcome"
```

GROUP RESULTS BASED ON UNIQUE VALUES OF
THE SELECTED COLUMN

Boosters Carried Maximum Payload

Booster_Version
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

QUERY USED IN SQL:

```
%%sql  
select distinct "Booster_Version" from SPACE_TABLE  
where "PAYLOAD_MASS_KG_" = (select max("PAYLOAD_MASS_KG_") from SPACE_TABLE)
```

USING DISTINCT TO GET UNIQUE
VALUES FROM THE COLUMN

SUBQUERY USED TO RETURN THE MAX VALUE

FILTER USING A BOOLEAN OPERATOR AND THE
"RIGHT HAND SIDE" IS GIVEN BY ANOTHER QUERY

2015 Launch Records

<code>substr("Date", 6,2)</code>	<code>Landing_Outcome</code>	<code>Booster_Version</code>	<code>Launch_Site</code>
01	Failure (drone ship)	F9 v1.1 B1012	CCAFS LC-40
04	Failure (drone ship)	F9 v1.1 B1015	CCAFS LC-40

FUNCTION USED TO EXTRACT THE
MONTH FROM THE DATE COLUMN

QUERY USED IN SQL:

```
%%sql
select  substr("Date", 6,2),"Landing_outcome","Booster_Version","Launch_Site" from SPACEXTABLE
where "Landing_outcome"=="Failure (drone ship)" and substr(Date,0,5)="2015"
```

FILTER USING A BOOLEAN OPERATOR

FUNCTION USED TO EXTRACT THE
YEAR FROM THE DATE COLUMN

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

Landing_Outcome	count("Landing_outcome")
-----------------	--------------------------

Controlled (ocean)	3
--------------------	---

Failure (drone ship)	5
----------------------	---

Failure (parachute)	2
---------------------	---

No attempt	10
------------	----

Precluded (drone ship)	1
------------------------	---

Success (drone ship)	5
----------------------	---

Success (ground pad)	3
----------------------	---

Uncontrolled (ocean)	2
----------------------	---

QUERY USED IN SQL:

RETURN THE COLUMN FROM TABLE
AND THE COUNT FOR EACH DISTINCT
VALUE

```
%%sql
select "Landing_outcome",count("Landing_outcome") from SPACEXTABLE
where "Date" between "2010-06-04" and "2017-03-20"
group by "Landing_outcome"
```

THE BETWEEN-AND OPERATOR TO FILTER RESULTS
BASED ON NUMERICAL VALUES

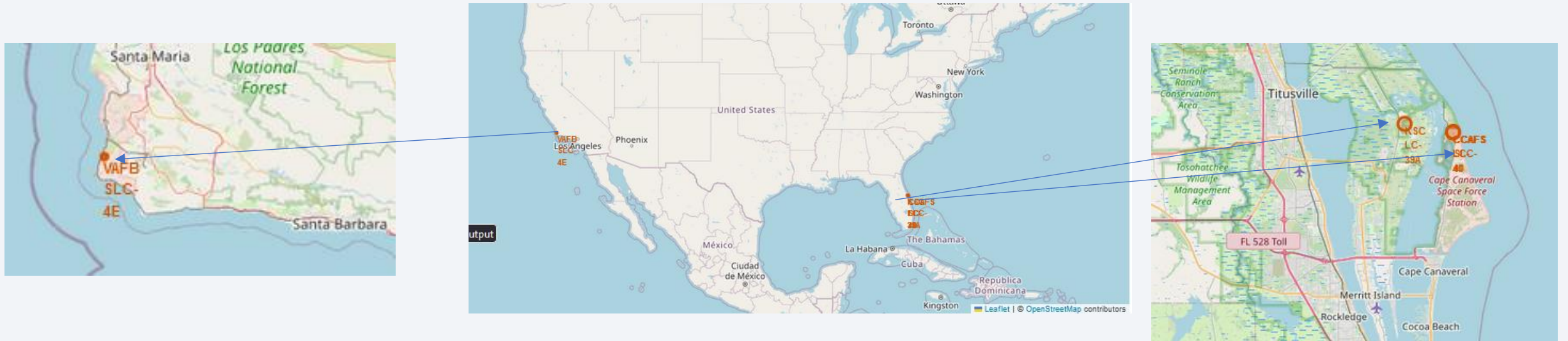
GROUP RESULTS BASED ON
UNIQUE VALUES OF THE
SELECTED COLUMN

A satellite view of Earth from space, showing the curvature of the planet and city lights at night. The background is a deep blue gradient.

Section 3

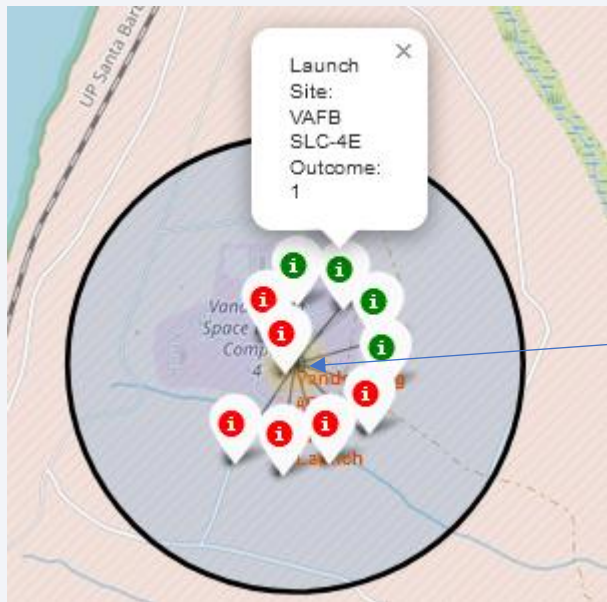
Launch Sites Proximities Analysis

Launch sites in USA



Launch sites appear to be near the coastline of the continental USA and near the equator line.

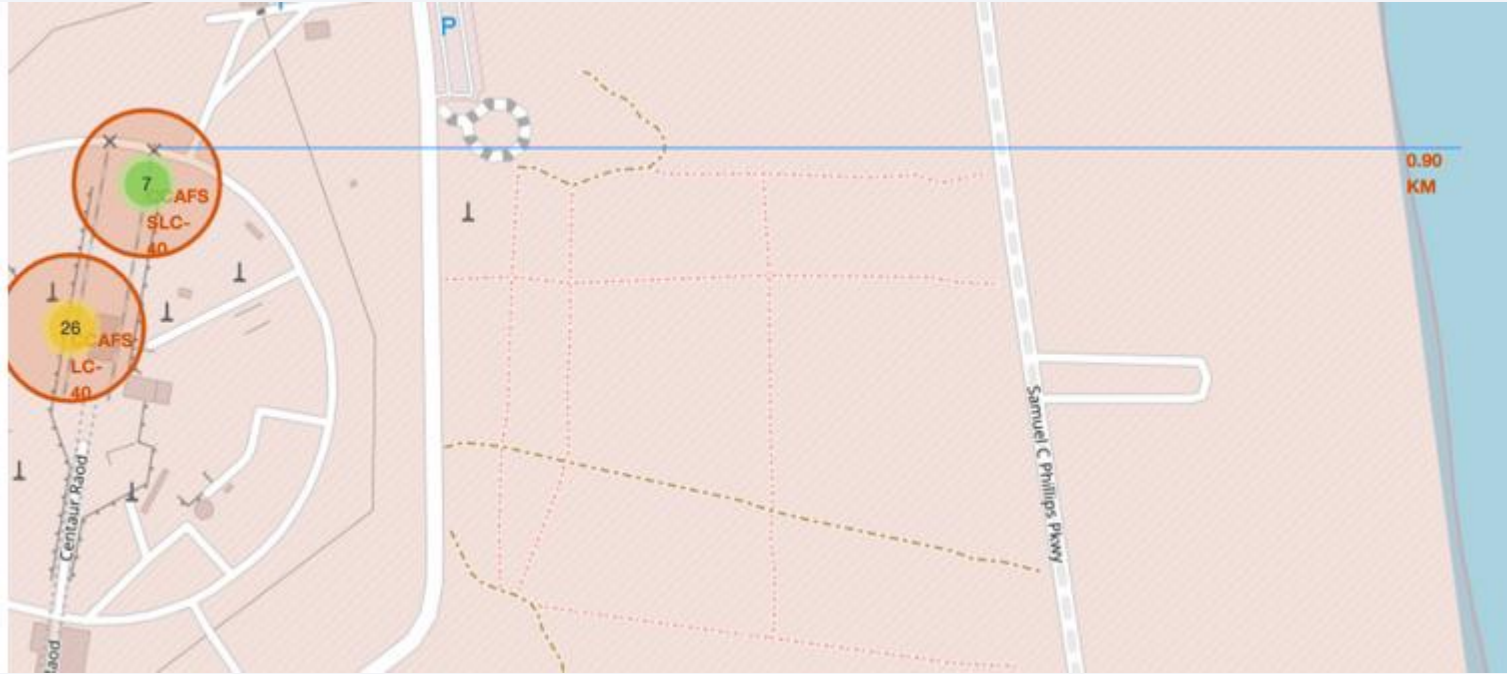
Visualizing the successes/failures for each launch site



By adding markers for each launch we can easily examine which site has a highest success rate

For example: the KSC LC-39A launch site seems to be linked with a higher success rate in comparison to the VAFB SLC-4E launch site

Visualizing distance from coastline





Section 4

Build a Dashboard with Plotly Dash

Success percentage for each site

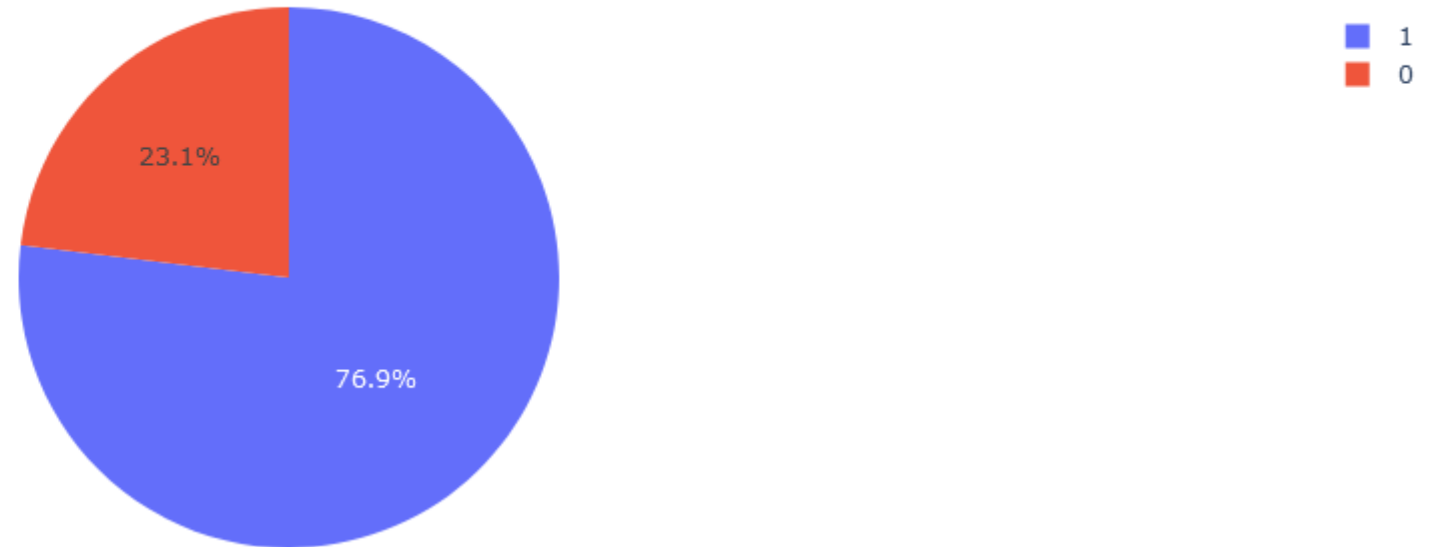
Total successes from all Launch Sites



KSC-LC-39A contributes the most to successful launches

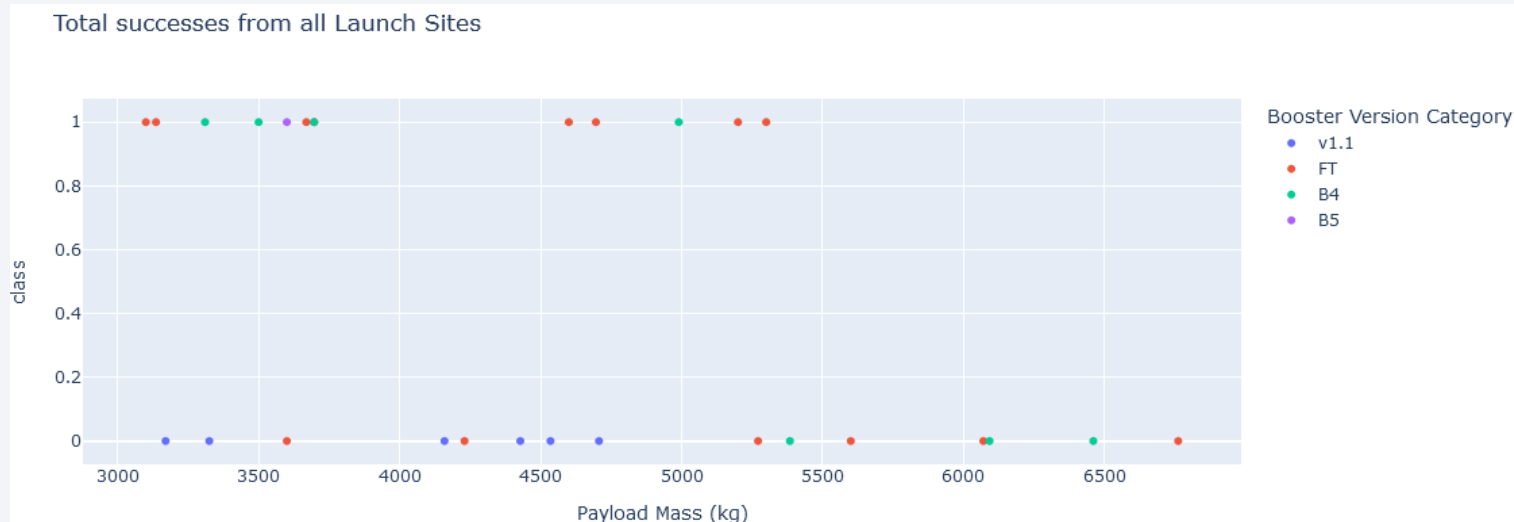
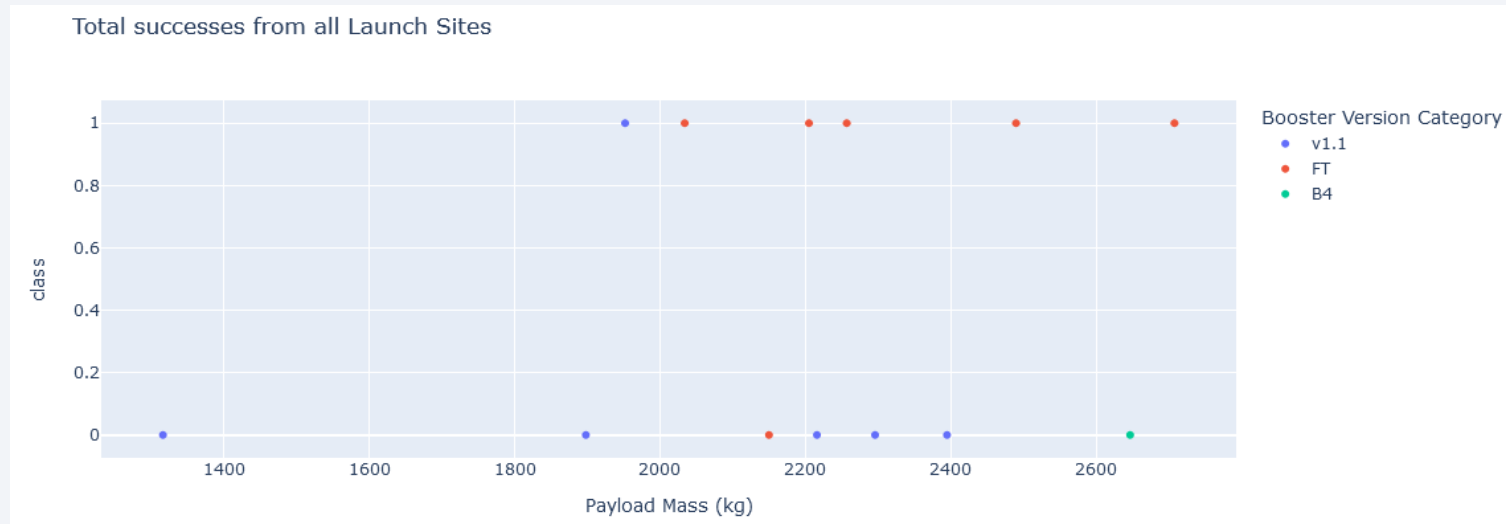
Success vs Failure for KSC LC-39A

Success vs Failure for KSC LC-39A



Success is 3 times more likely for the launch site KSC LC-39A

Comparing successes for all sites on different weight ranges

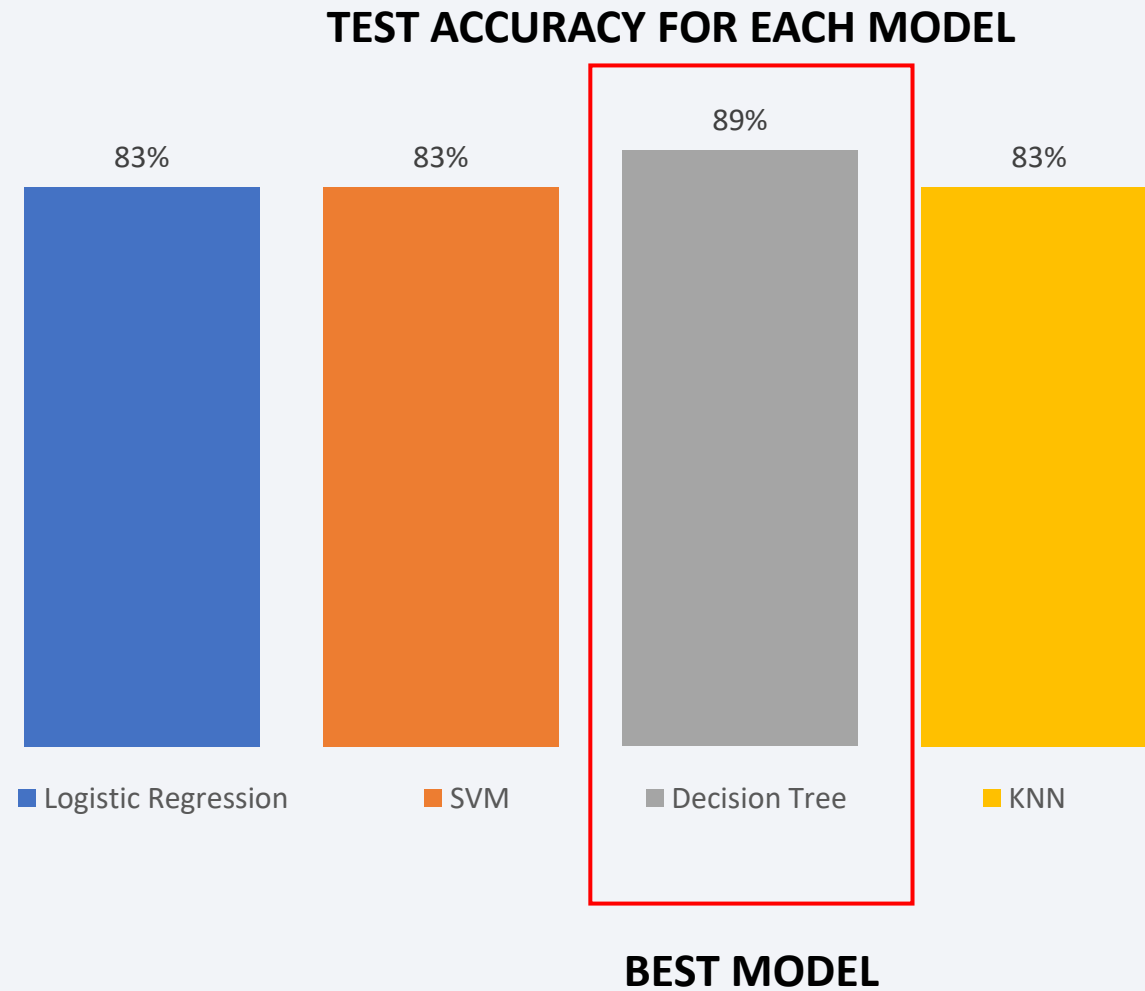


As weight increases
the launches become
more successful

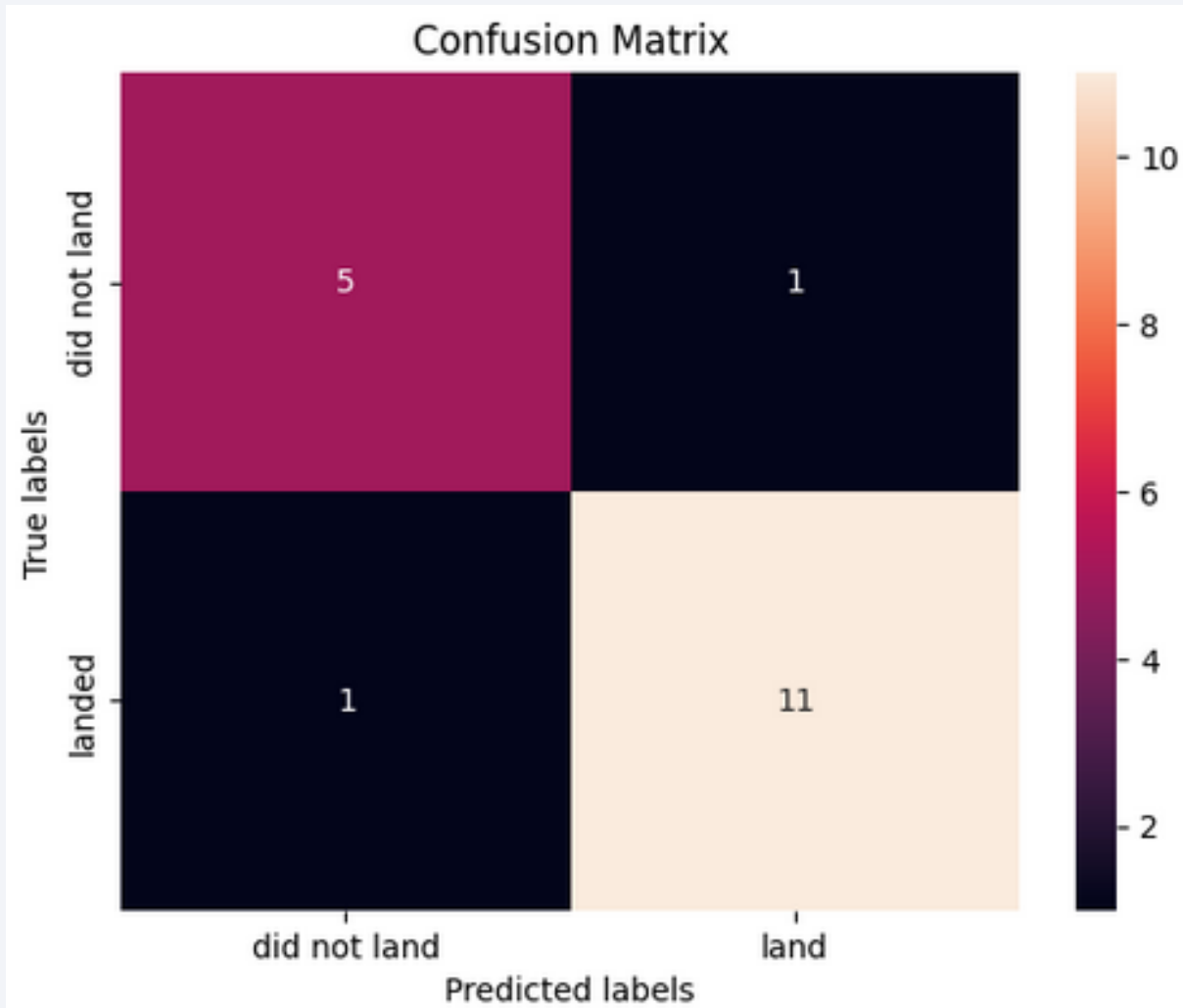
Section 5

Predictive Analysis (Classification)

Classification Accuracy



Confusion Matrix



Out of 18 test cases 16 were correctly identified.
1 case of false positive
1 case of false negative

Conclusions

- Point 1
- Point 2
- Point 3
- Point 4
- ...

Appendix

- Include any relevant assets like Python code snippets, SQL queries, charts, Notebook outputs, or data sets that you may have created during this project

Thank you!

