

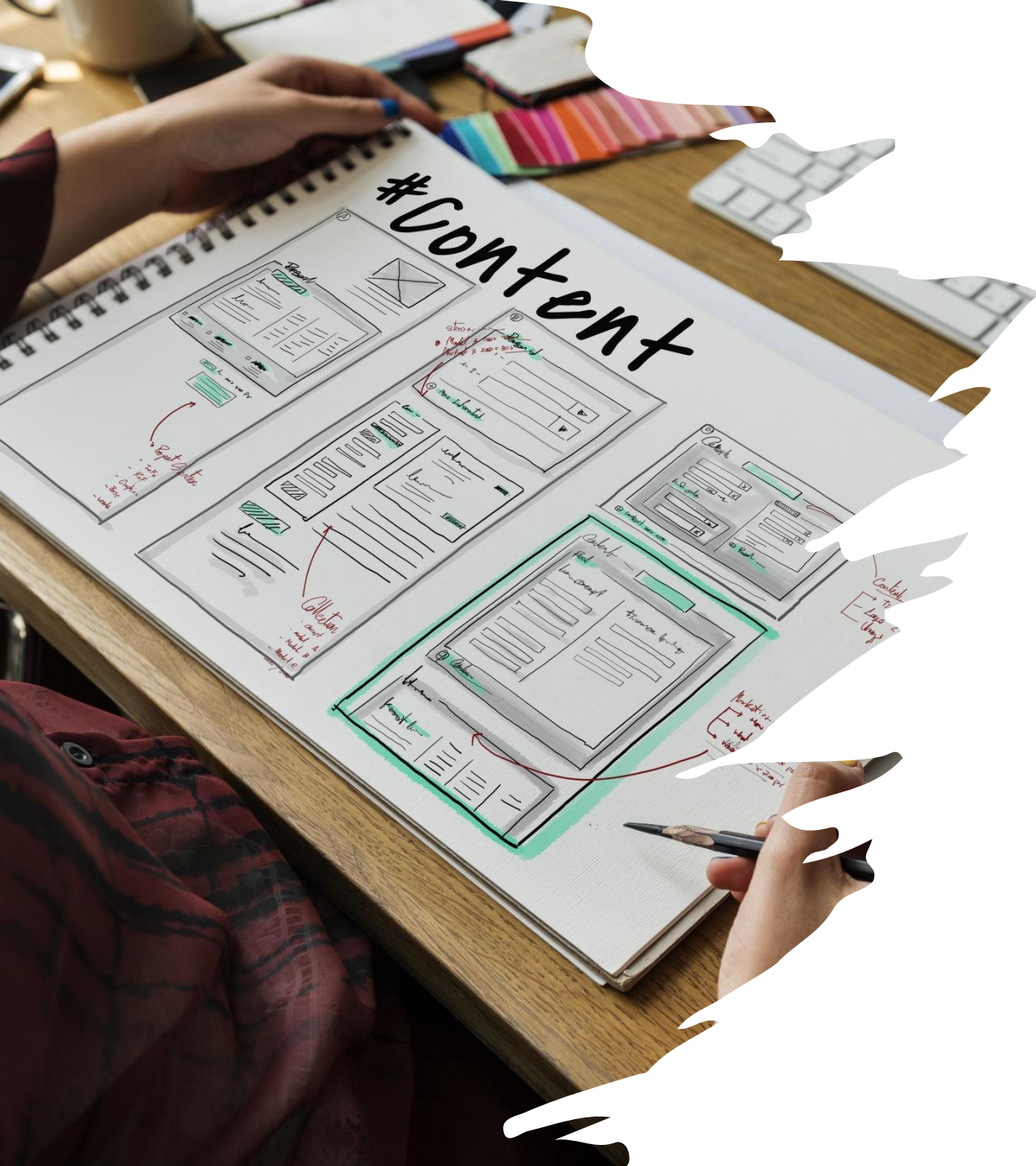


IBM Developer  
SKILLS NETWORK

# Winning Space Race with Data Science

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2023.6.14





# Outline

- Executive Summary
- Introduction
- Methodology
  - Data collection
  - Data wrangling
- Results
  - Data analysis
  - Data visualization
- Conclusion
- Appendix



# Executive Summary

- To review and analyze available data on SpaceX
- Using different methods for analysis
  - EDA with SQL and Python
  - Machine learning
  - Others

<https://github.com/LJY715/Capstone-project/tree/main>

# Introduction

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- Objective - This project is carried out to predict and evaluate the cost and outcome of rocket launch based on website data
- Problems – the impact of rocket landing, under what conditions can SpaceX get the best result

Section 1

# Methodology

# Methodology

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- Data collection methodology:
  - Data collection thru API
  - Web wrangling thru Pandas
- Perform data wrangling
  - Clean data by delete invalid data
  - Encode to make them reflect in correct format
- Perform exploratory data analysis (EDA) using visualization and SQL
- Perform interactive visual analytics using Folium and Plotly Dash
- Perform predictive analysis using classification models
  - Building, tuning, evaluating classification models

# Data Collection

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Collect data with API



Convert data and update  
row and column titles



Filter data to focus on  
falcon9



Convert file to CSV

Create beautiful soup



Get column title and  
create launch dict



Convert to data frame



Convert file to CSV

# Data Collection – SpaceX API

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Collect  
data  
with  
API  
calls

Convert  
to data  
frame

Update  
row  
and  
column

Filter  
data to  
keep  
falcon 9  
only

Convert  
to CSV  
file



# Data Collection - Scraping

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Create  
beautiful  
soup

Get  
column  
titles

Create  
launch  
dict

Convert  
to data  
frame

Convert  
to CSV  
file

# Data Wrangling

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Starting with exploratory data analysis, calculate the number of launches by different sites, then calculate the number and occurrence of mission outcome per orbit, then export the data to CSV file, finally to create landing outcomes labels.

# EDA with Data Visualization

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- Explore the data, by using scatterplots to visualize the relationship

# EDA with SQL

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- Names of the unique launch sites in the space mission
- Top 5 launch sites whose name begin with the string 'CC
- Total payload mass carried by boosters launched by NASA (CRS)
- Average payload mass carried by booster version F9
- List the date when the first successful landing outcome was achieved
- List names of the boosters that have success in drone ship and have payload mass greater than 4000 but less than 6000
- List total number of successful and failure mission outcomes
- List booster versions names that have carried the maximum payload mass
- Rank Landing Outcomes Between 2010-06-04 and 2017-03-20



# Build an Interactive Map with Folium

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- Utilized markers, circles, lines in the folium maps.
- Mark can indicate points, e.g. launch sites
- Circles are above marks on the map
- Lines can indicate the distance

# Build a Dashboard with Plotly Dash

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- Dashboard is a very important tool for visualization
- Use plotly to create graphs, charts and scatterplots.

# Predictive Analysis (Classification)

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- Compare 4 different classification models, including logistic regression, support vector machine, decision tree and K-nearest neighbors.
- To prepare and clean the data first, then test each models and compare the results.

# Results

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- There are 4 different launch sites
- Basically all mission outcomes are successfully
- The landing successful rate gets better with time going by
- Most launches happened at east coast



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 half of the image. The overall effect is dynamic and technological.

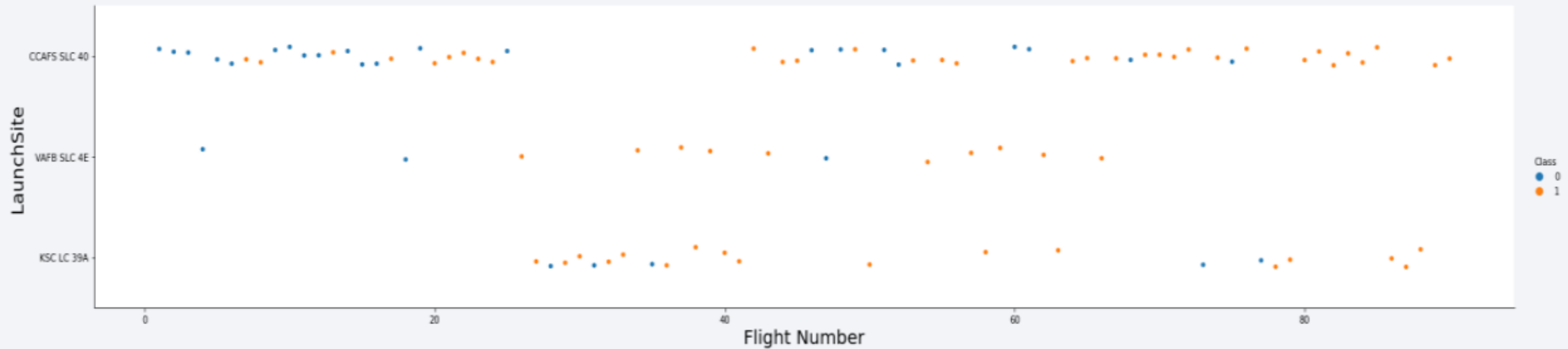
Section 2

# Insights drawn from EDA



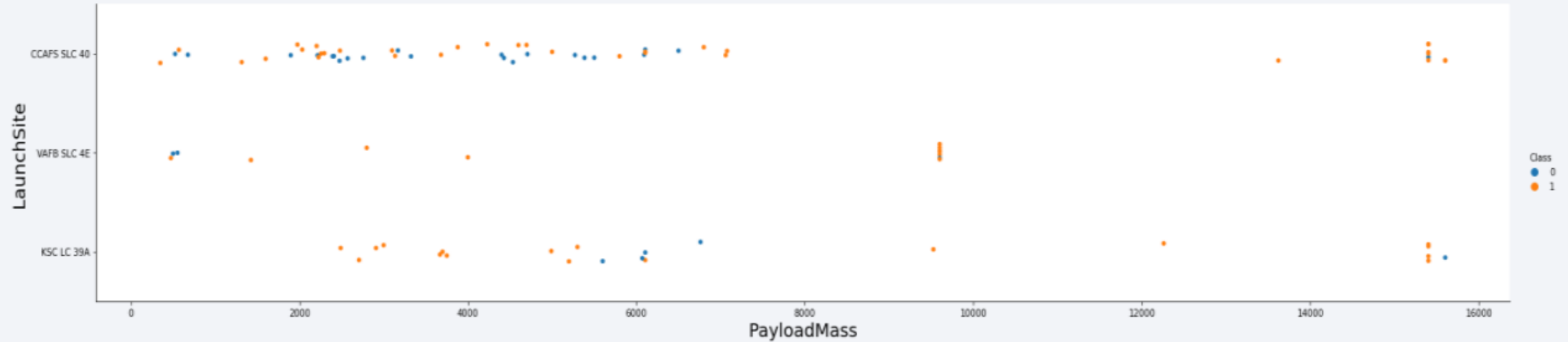
# Flight Number vs. Launch Site

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There's positive relationship between the number of flights and success rate

# Payload vs. Launch Site



with payload mass increase, the success rate increase as well

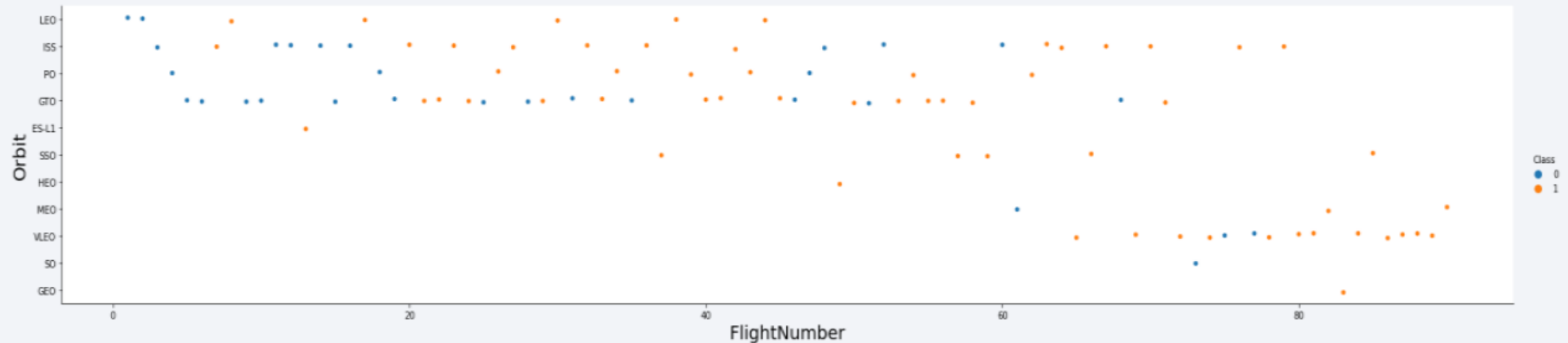
# Success Rate vs. Orbit Type

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- The biggest success rates happens to orbits: ES-L1; GEO; HEO; SSO.
- Followed by:  
VLEO (above 80%); and LFO (above 70%)

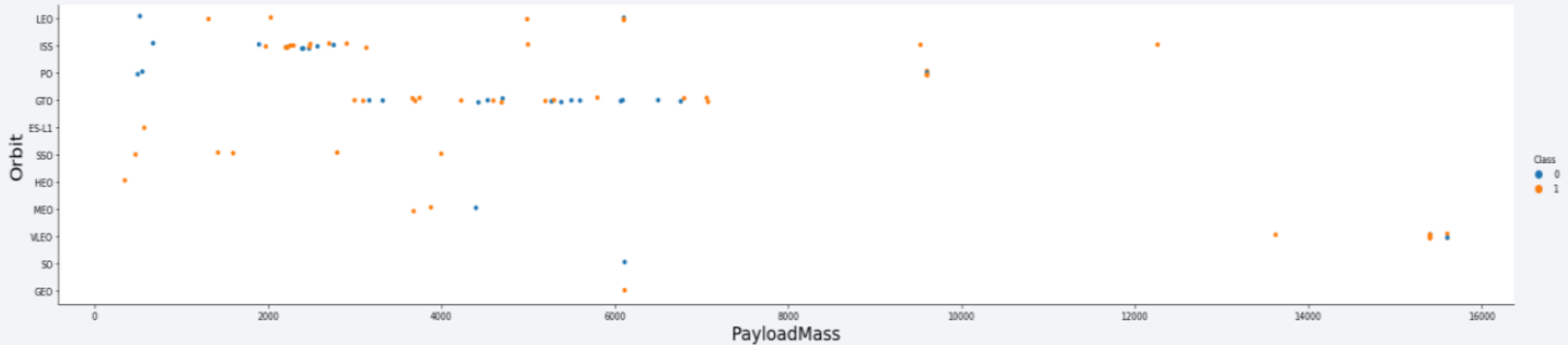


# Flight Number vs. Orbit Type



From the chart, there is no clear relationship between flight number and orbit

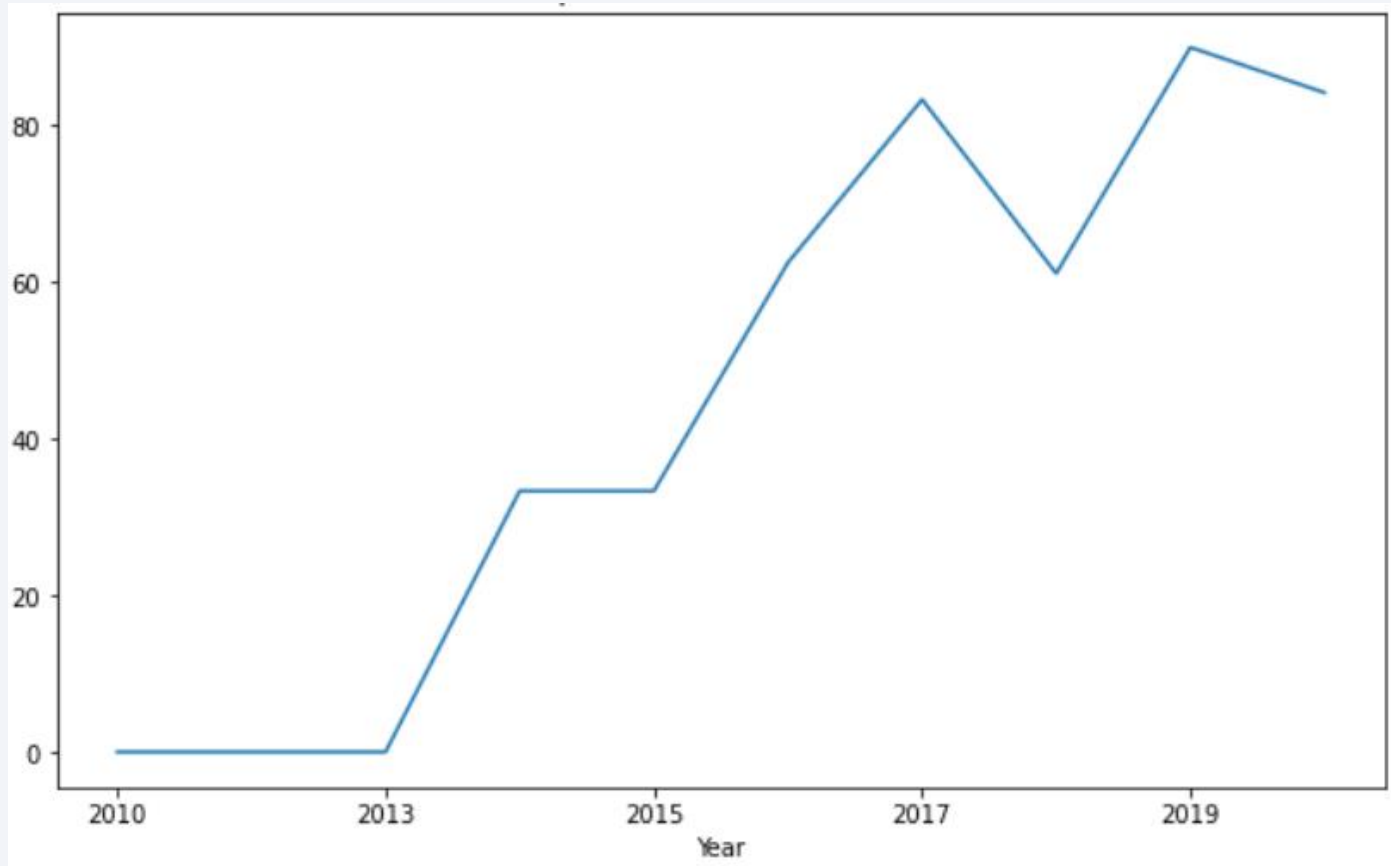
# Payload vs. Orbit Type



Based on the chart, there is no clear relationship between payload and successful rate

# Launch Success Yearly Trend

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The successful rate start to increase from 2013, and keep the trend till 2020

# All Launch Site Names

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## **launch site**

KSC LC-39A

CCAFS LC-40

CCAFS SLC-40

VAFB SLC-4E

Select unique launch site values from the data



# Launch Site Names Begin with 'CCA'

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	FlightNumber	Date	BoosterVersion	PayloadMass	Orbit	LaunchSite	Outcom
4	1	2010-06-04	Falcon 9	NaN	LEO	CCSFS SLC 40	None None
5	2	2012-05-22	Falcon 9	525.0	LEO	CCSFS SLC 40	None None
6	3	2013-03-01	Falcon 9	677.0	ISS	CCSFS SLC 40	None None
7	4	2013-09-29	Falcon 9	500.0	PO	VAFB SLC 4E	False Ocean
8	5	2013-12-03	Falcon 9	3170.0	GTO	CCSFS SLC 40	None None

# Average Payload Mass by F9 v1.1

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**Average payload mass**  
45596

Filter booster version and calculate the average payload mass

# First Successful Ground Landing Date

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**first successful date**

2015/12/22

Filter successful data and the minimum landing outcome is 2015/12/22

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

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### **Booster version**

F9 FT B1022

F9 FT B1026

F9 FT B1021.2

F9 FT B1031.2

Boosters that successfully landing on the drone ship and have payload above 4000 but less than 6000.

After filters, there're 4.

# Total Number of Successful and Failure Mission Outcomes

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**Successful mission outcome**

**Failure mission outcome**

**Success outcome**

0      100

**Failure outcome**

0      1

# Boosters Carried Maximum Payload

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Boosters that have the highest payload mass

Booster version	Payload mass
F9 B5 B1048.4	15600
F9 B5 B1048.5	15600
F9 B5 B1049.4	15600
F9 B5 B1049.5	15600
F9 B5 B1049.7	15600
F9 B5 B1051.3	15600
F9 B5 B1051.4	15600
F9 B5 B1051.6	15600
F9 B5 B1056.4	15600
F9 B5 B1058.3	15600
F9 B5 B1060.2	15600
F9 B5 B1060.3	15600

# 2015 Launch Records

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There are only two occurrences

Booster Version	Launch Site
F9 v1.1 B1012	CCAFS LC-40
F9 v1.1 B1015	CCAFS LC-40



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

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landing outcome	count
No attempt	10
Success (drone ship)	6
Failure (drone ship)	5
Success (ground pad)	5
Controlled (ocean)	3
Uncontrolled (ocean)	2
Precluded (drone ship)	1
Failure (parachute)	1

Must note there're "No attempt"

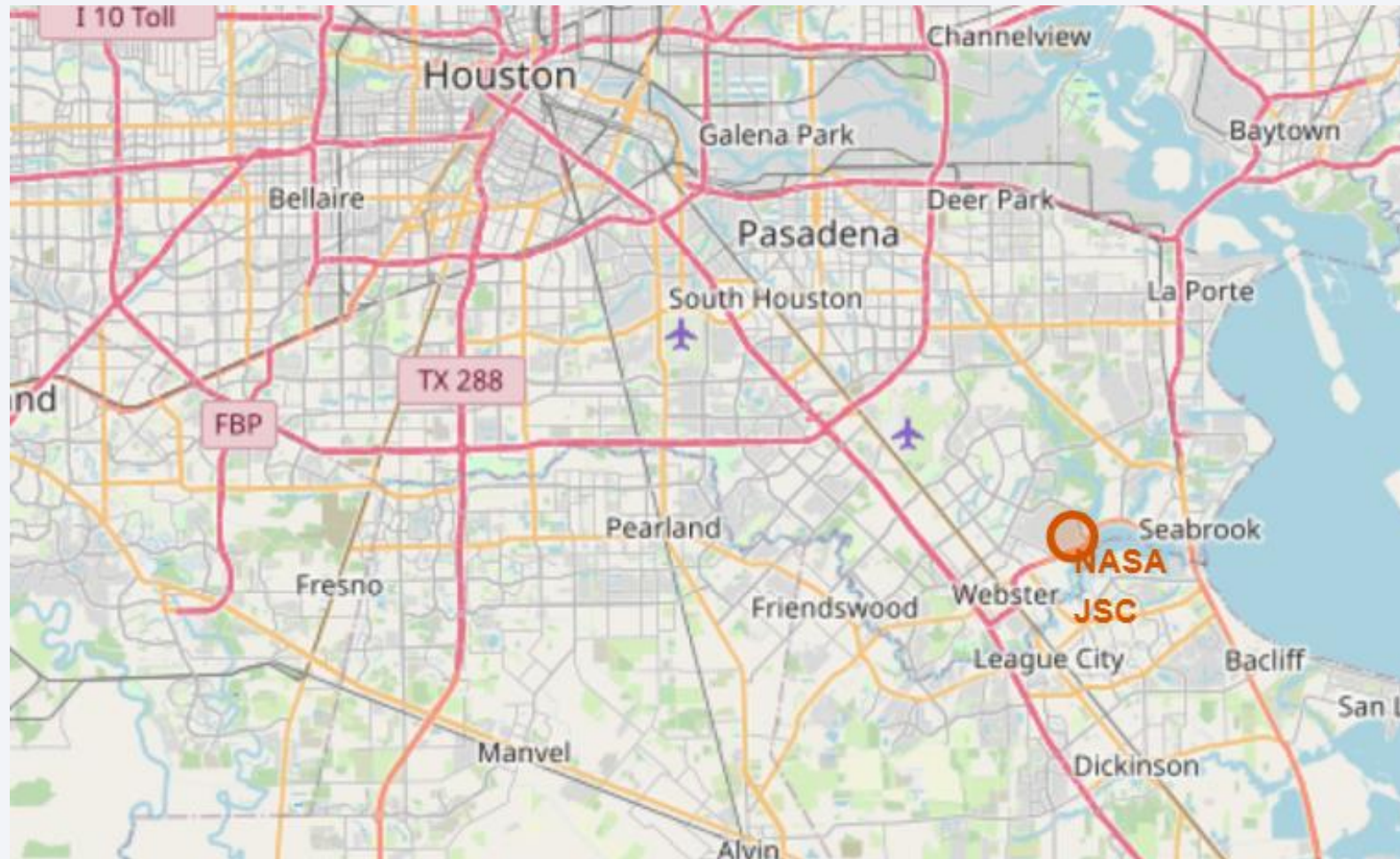
A satellite view of Earth from space, showing the curvature of the planet and city lights at night. The background is a deep blue gradient.

Section 3

# Launch Sites Proximities Analysis

# All launch site

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# Launch outcome

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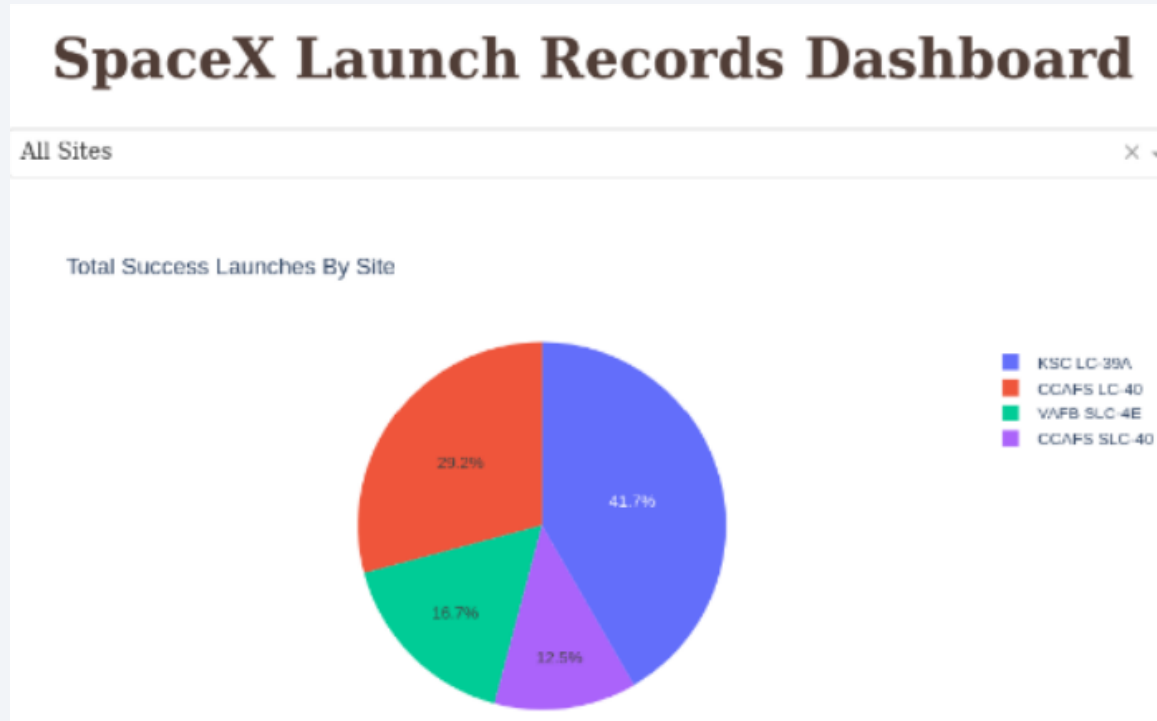


Section 4

# Build a Dashboard with Plotly Dash

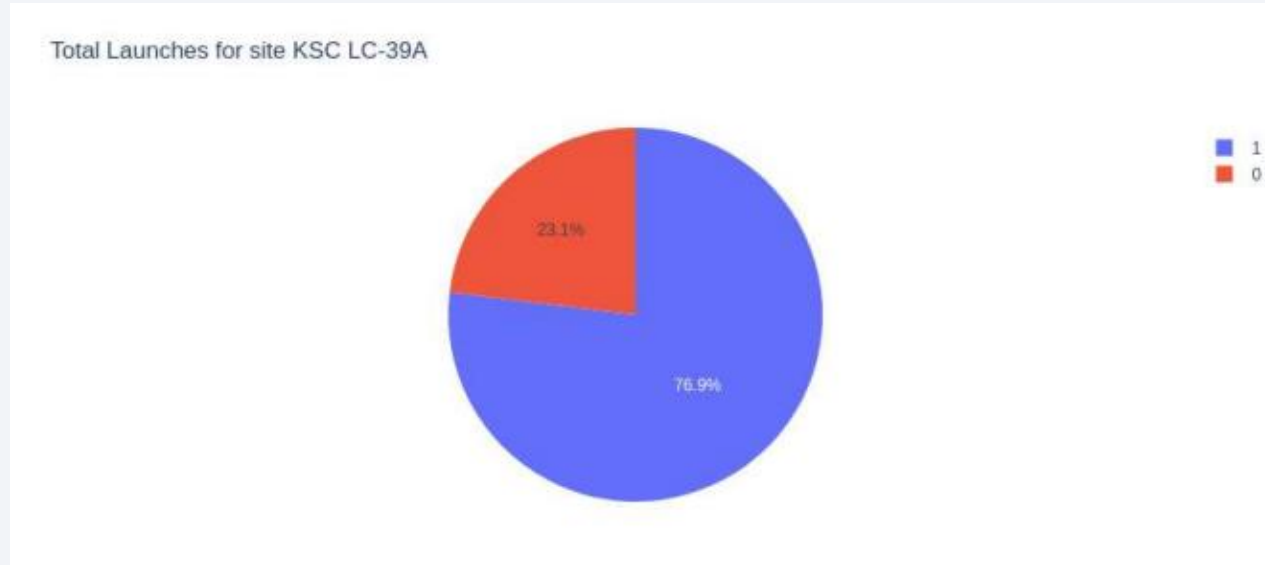
# Launch success – dashboard

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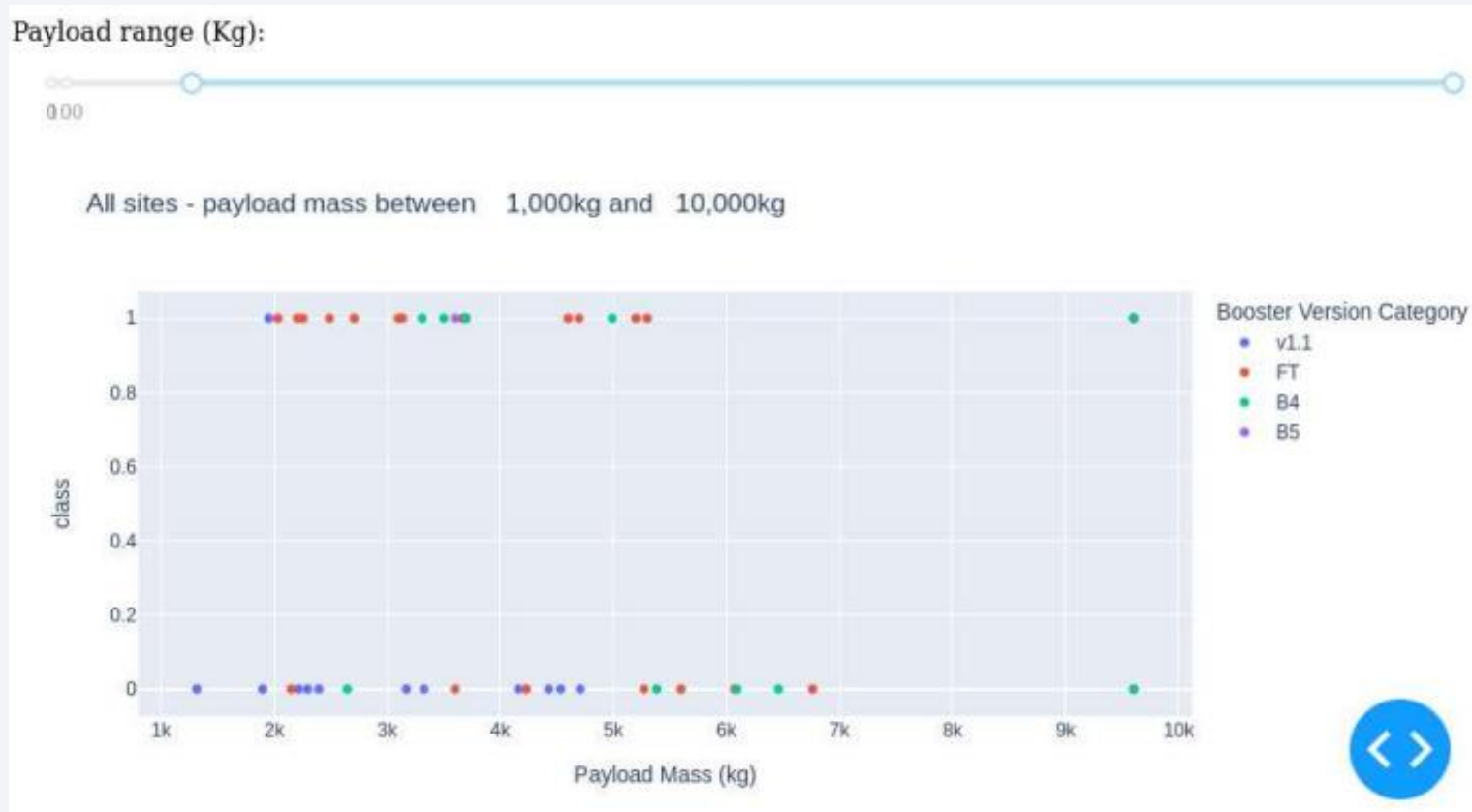
# Launch success rate – dashboard 2

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# Success rate vs payload



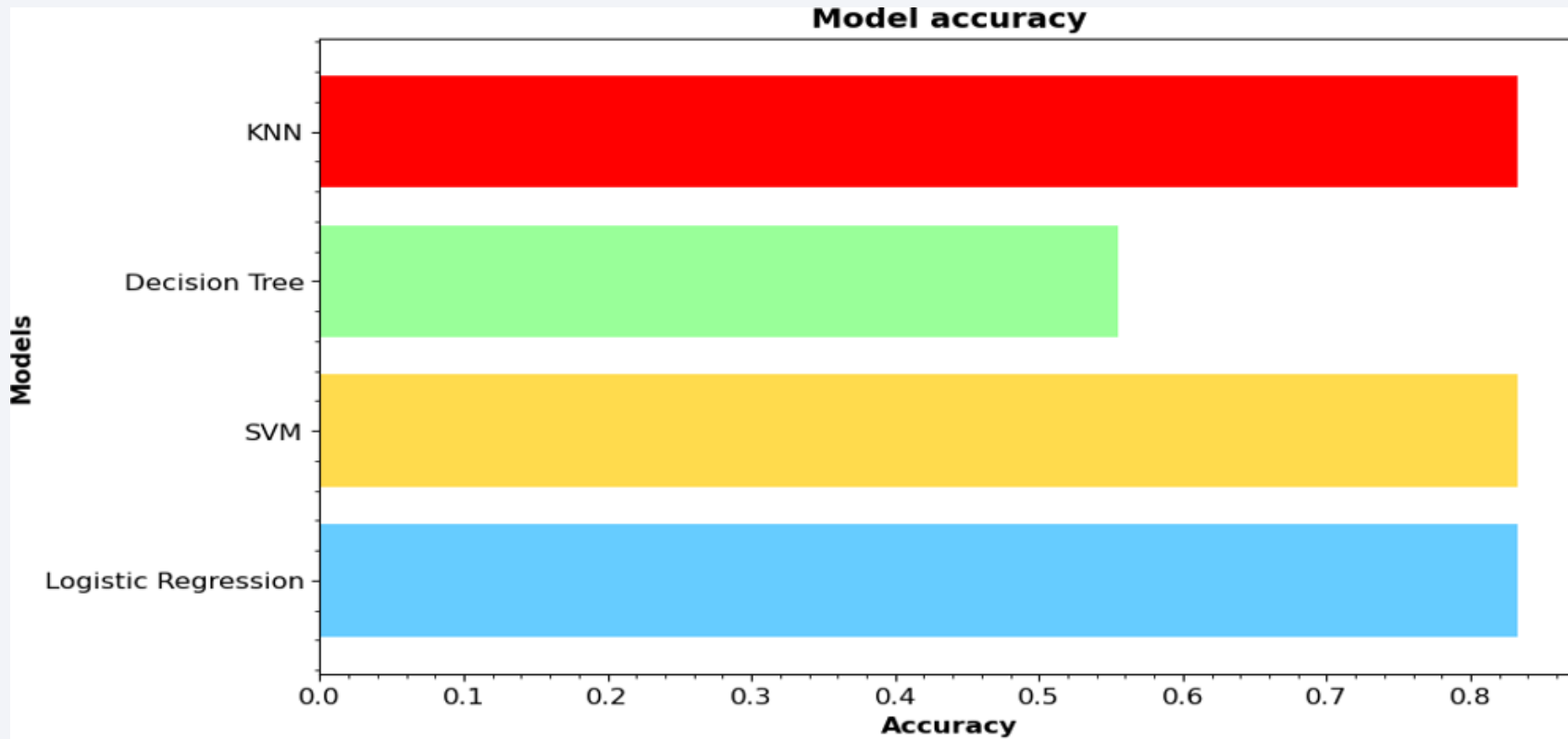


Section 5

# Predictive Analysis (Classification)

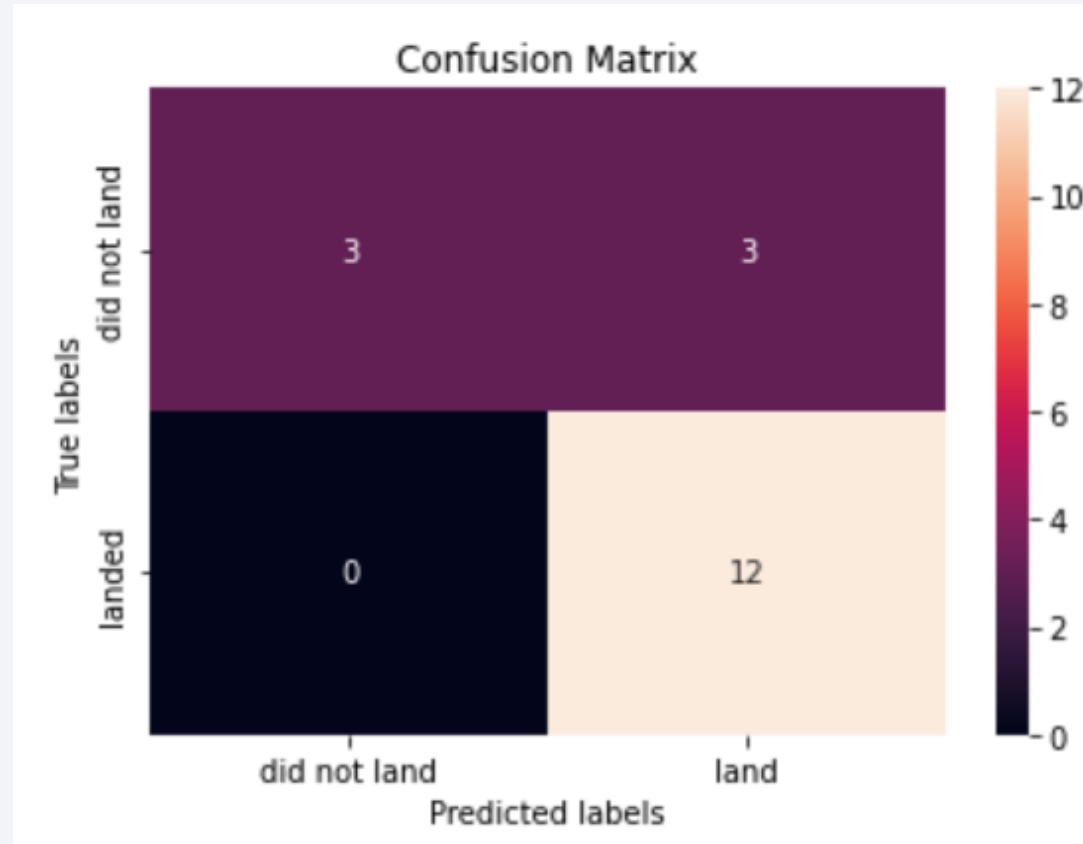
# Classification Accuracy

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# Confusion Matrix

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# Conclusions

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- KSC LC-39A is the best launch
- Orbit GEO, HEO, SSO, ES-L1 have high success rate
- Low weight payloads perform better
- Success rate grow up with time going by
- Different prediction model drives to basically same precision

# Appendix

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- 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!

