

FINAL PROJECT REPORT

Date	19 November 2022
Team ID	PNT2022TMID32830
Project Name	Flight Delay Prediction Using Machine Learning

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I. Introduction

1. Project Overview

Airports are significant nodes of air transportation. The number of airport flight delays has been on increase in recent years. Delayed flights are defined by the Federal Aviation Administration when they arrive or depart more than 15 minutes later than scheduled. In 2019, the arrival delay rate is 19.2% and the departure delay rate is 18.18% in the United States. Flight delays can cause many negative effects, such as passengers' inconvenience, increased airport pressure, and airline losses. Effective flight delay prediction could provide support for flight plan and emergency plan formulation, reduce the economic loss, and alleviate the negative impact (1). Hence, a delay prediction turns out very important. International Civil Aviation Organization (ICAO) has enabled a program called Air Traffic Flow Management (ATFM) with the objective of ensuring that the traffic volume is compatible with the capacities declared by aviation authorities in order to reduce ground and en-route delays. Another application of traffic management is the Free Route Airspace (FRA) concept which consists of using the shortest routes possible in order to reduce flight time, CO₂ emissions, and fuel waste. Moreover, several other models have been developed to solve delays problem based on probability, statistics, graph and network representations, operational research studies, and so on (2). The Related Work gives the recent works and research on this topic.

2. Purpose

The main purpose of this project is to early warning of flight delay to the customers, Airport Authorities and Airlines

II. Literature Survey

1. Existing problem

Passengers and airline wants a way to reduce economic loss, rushes, tension which caused by flight delay and make their travel happy.

2. References

The principle of the Stacking classification algorithm is introduced, the SMOTE algorithm is selected to process imbalanced datasets, and the Boruta algorithm is utilized for feature selection. There are five supervised machine learning algorithms in the first-level learner of Stacking including KNN, Random Forest, Logistic Regression, Decision Tree, and Gaussian Naive Bayes. The second-level learner is Logistic Regression. To verify the effectiveness of the proposed method, comparative experiments are carried out based on Boston Logan International Airport flight datasets from January to December 2019. Multiple indexes are used to comprehensively evaluate the prediction results, such as Accuracy, Precision, Recall, F1 Score, ROC curve, and AUC Score. The results show that the Stacking algorithm not only could improve the prediction accuracy but also maintains great stability (1). Multi Layer Perceptron (MLP) to train and test data applied. The neural network MLP was able to predict flight arrival delay with a coefficient of determination R^2 of 0.9048, and the selective procedure achieved a time saving and a better R^2 score of 0.9560. To enhance the reliability of the proposed method, the performance of the MLP was compared with that of Gradient Boosting (GB) and Decision Trees (DT). The result is that the MLP outperformed all existing benchmark methods (2). Here present the first data-driven systemic study of air transport delays in China, of their evolution and causes, based on 11 million flights between 2016 and 2018. A significant fraction of the delays can be explained by a few variables, e.g., weather conditions and

traffic levels, the most important factors being the presence of thunderstorms and the season of the year. Remaining delays can often be explained by en-route weather phenomena or by reactionary delays. This study contributes towards a better understanding of delays and their prediction through a data-driven methodology, leveraging on statistics and data mining concepts (3). Recognize useful patterns of the flight delay from aviation data and perform accurate delay prediction. The best result for flight delay prediction (five classes) using machine learning models is 89.07% (Multilayer Perceptron). A Convolution neural network model is also built which is enlightened by the idea of pattern recognition and success of neural network method, showing a slightly better result with 89.32% prediction accuracy (4). Explores a broader scope of factors which may potentially influence the flight delay, and compares several machine learning-based models in designed generalized flight delay prediction tasks. Compared with the previous schemes, the proposed random forest-based model can obtain higher prediction accuracy (90.2% for the binary classification) and can overcome the overfitting problem (5). The model demonstrated to reduce by 30% the take-off time prediction errors of the current system one hour before the time that flight is scheduled to depart from the parking position and presents an extension of the model, which overcomes this look-ahead time constraint and allows to improve take-off time predictions as early as the initial flight plan is received. In addition, a subset of the original set of input features has been meticulously selected to facilitate the implementation of the solution in an operational air traffic flow and capacity management system, while minimising the loss of predictive power. Finally, the importance and interactions of the input features are thoroughly analysed with additive feature attribution methods (6). The designed prediction tasks contain different classification tasks and a regression task. Experimental results show that long short-term memory (LSTM) is capable of handling the obtained aviation sequence data, but overfitting problem occurs in our limited dataset. Compared with the previous schemes, the proposed random forest-based model can obtain higher prediction accuracy (90.2% for the binary classification) and can overcome the overfitting problem (7).

References

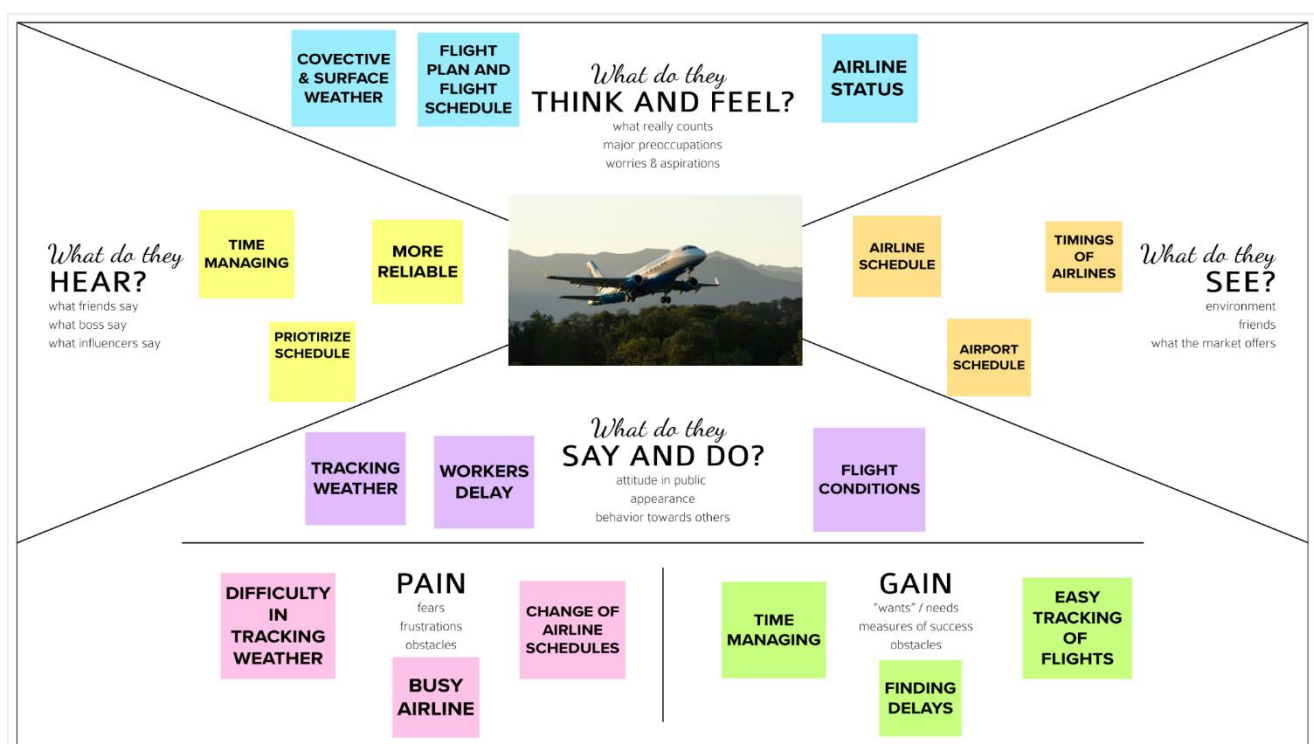
1. *Flight Delay Classification Prediction Based on*. Jia Yi, 1 Honghai Zhang, . [ed.] Chi-Hua Chen. Honghai Zhang; zhh0913@163.com : Wiley, 2021. p. 10.
2. *A Multilayer Perceptron Neural Network with Selective-Data*. Hajar Alla, Lahcen Moumoun, and Youssef Balouki. [ed.] Jianping Gou. Settati, Morocco : Hindawi, 2021. Hindawi Scientific Programming. p. 12.
3. *Characterization and Prediction of Air Transport*. Massimiliano Zanin 1, *, Yanbo Zhu 2,3, Ran Yan 3. 2020, MDPI Journals, p. 15.
4. *Applying Machine Learning to Aviation Big Data*. Yushan Jiang, Yongxin Liu, Dahai Liu, Houbing Song. 2020. 2020 IEEE Intl Conf on Dependable, Intl Conf on Cloud and Big Data Computing. p. 8.
5. *FLIGHT DELAY PREDICTION USING MACHINE LEARNING*. Sarah Ajmeria, Srushti V, Prof. Kavitha S Patil. Bangalore, India : IJIREEICE, 2022. DOI: 10.17148/IJIREEICE.2022.10584. p. 5.
6. *An explainable machine learning approach to improve take-off time*. Ramon Dalmau, Franck Ballerini, Herbert Naessens, Seddik Belkoura. 2021, Journal of Air Transport Management, p. 12.
7. *Flight Delay Prediction Based on Aviation Big Data*. Guan Gui, Senior Member, IEEE, Fan Liu, Student Member, IEEE, Jinlong Sun, Member, IEEE,. 2020, IEEE TRANSACTIONS ON VEHICULAR TECHNOLOGY, VOL. XX, NO. XX, XXX 2015, p. 11.

3.Problem statement definition

Problem Statement (PS)	I am (Customer)	I'm trying to	But	Because	Which makes me feel
PS-1	Passenger	Reach my destination with nice and happy travel experience	Sometimes rushes and tensions happen	Flight delay, diversion and cancelation	Frustrated and upset.
PS-2	Airlines and Airport companies	Gives best and pleasant experience for passengers	Sometimes became a one of worst experience for passengers	Flight delay, diversion and cancelation causes economic losses and damage the brand value in market and society	Discourage, less effective and vague

III. Ideation & Proposed Solution

1. Empathy Map Canvas



2.Ideation & Brainstorming

2

Brainstorm

Write down any ideas that come to mind that address your problem statement.

🕒 10 minutes

TIP



You can select a sticky note and hit the pencil [switch to sketch] icon to start drawing!

Arsah A

The passenger should be able to get the intimation of flight delay a hour or few hours before

Should state the reason for flight delay

The passenger should get to know the updated time of arrival and departure

In case if the delay time is more in that case the application should help the user get a compensation

The application must be user friendly

Application should make arrangements for lounge or waiting area

Karolin Kiruba R

Monitor the flights arrival and departure

Keeping an eye on the weather conditions

Understand why flights get delayed

Book a backup flight in the last case

Checking the airport website for possible related delays

Re-search alternate flights with the same airline, partner airlines, even competitors

Kishan J

If flight gets delayed more often for a certain destination on the same day in that case all the flight must be cancelled for that destination on that day

Passengers should get notified by the flight delay details

Flight data should be updated frequently

Weather updation should be done frequently

Weather prediction should be done before flight timings

Connecting social media to get weather prediction and other problems

Neekita C

Flight delay duration should be informed to the passengers

Weather predictions of one week should be found earlier for smooth air routes

Check-in delays should be avoided

People should follow certain instructions to ensure the smooth flight travels

If external or unpredictable factor causes the unexpected delay, it should be informed to passengers priorly

Application should suggest ways to adjust passenger's leisure time due to flight delay

Sri Jane A

Passengers flight details should match with the upcoming flights

Should get the updated timings

The departure timing and reason for the delay must be known

Weather details of the destination should be available for the user

The application environment should be user friendly

The passenger should get the intimation of flight in prior

3

Group ideas

Take turns sharing your ideas while clustering similar or related notes as you go. Once all sticky notes have been grouped, give each cluster a sentence-like label. If a cluster is bigger than six sticky notes, try and see if you can break it up into smaller sub-groups.

🕒 20 minutes



4

Prioritize

Your team should all be on the same page about what's important moving forward. Place your ideas on this grid to determine which ideas are important and which are feasible.

🕒 20 minutes



3.Proposed Solution

S.No.	Parameter	Description
1.	Problem Statement (Problem to be solved)	Developing A Flight Delay Prediction Model Using Machine Learning
2.	Idea / Solution description	A model which will predict the delay in arrival and departure of the flight in order to optimize flight operations and minimize the delays
3.	Novelty / Uniqueness	The model would state the reason for the delay to passenger and will also check the alternate routes and the availability of seats in backup flights
4.	Social Impact / Customer Satisfaction	With the help of this model the passengers would be able to manage the time in a efficient and effective way
5.	Business Model (Revenue Model)	
6.	Scalability of the Solution	This model can cater only up to a certain extent due to limited data set but with the availability of live data set and proper machine learning algorithms we can increase the accuracy in near future

4. Problem Solution Fit

Project Title: Flight delay prediction

Project Design Phase-I - Solution Fit Template

Team ID: PNT2022TMID32830

Define CS, fit into CC	1. CUSTOMER SEGMENT(S) CS <p>The passengers who have the flights scheduled to be taken</p>	6. CUSTOMER CONSTRAINTS CC <p>The passengers flight details must match with the scheduled flights</p>	5. AVAILABLE SOLUTIONS AS <p>The available models would just state the reason for the delay along with the updated time of arrival and departure</p>	Explore AS, differentiate
	2. JOBS-TO-BE-DONE / PROBLEMS J&P <p>Flight delays making it difficult for the passengers and causing financial losses, the dissatisfaction of passengers, time losses, loss of reputation and bad business relations</p>	9. PROBLEM ROOT CAUSE RC <p>Flight delay due to bad weather, air traffic, check-in delays, inoperative machineries and other unpredictable and unavoidable conditions.</p>	7. BEHAVIOUR BE <p>Match the flight details with the scheduled flights or enter the flight details then check the time of scheduled arrival and departure and if the flight delayed then find the updated time of arrival and departure and reason for the delay. The passenger can also check the availability of backup flights in case of long delays.</p>	
Focus on J&P, fit into BE, understand RC				Focus on AS, fit into BE, understand RC

Identify strong TR & EM	3. TRIGGERS TR The unusual flight delay, disturbing the daily schedules or planned activities of passengers and also impacts on the emergency situations of passengers	10. YOUR SOLUTION SL The model would state the reason for the delay along with the updated time of arrival and departure to the passenger and will also check the alternate routes and the availability of seats in backup flights	8. CHANNELS of BEHAVIOUR CH 8.1 ONLINE <ul style="list-style-type: none"> Enter the flight details and match it with the scheduled flights. Get to know the reason for the delay Search of the backup flights 8.2 OFFLINE Will get to know the updated time arrival and departure .	Identify strong TR & EM
	4. EMOTIONS: BEFORE / AFTER EM Due to delay in flights the entire plan of the passengers would be collapsed but with the predictions in flight delay the passengers can manage their time in a efficient and effective way			

IV. Requirement Analysis

1.Functional Requirements:

Following are the functional requirements of the proposed solution.

FR No.	Functional Requirement (Epic)	Sub Requirement (Story / Sub-Task)
FR-1	User Registration	Registration through Form Registration through Gmail
FR-2	User Confirmation	Confirmation via Email Confirmation via OTP
FR-3	Log In	Log in with give user credentials
FR-4	Support	Support option provided for queries and contact customer support team
FR-5	Prediction of delay	Requesting for prediction by providing details of flight Shows prediction results
FR-6	Trust ability of prediction	Gives the confidence percentage about their prediction
FR-7	Notify User	Notify user with the prediction, if they wish Notify user about flight arrival before 1 hour

FR-8	Get Feedback	Get feedback about their experience Request give rating
FR-9	Log Out	Log out from the application

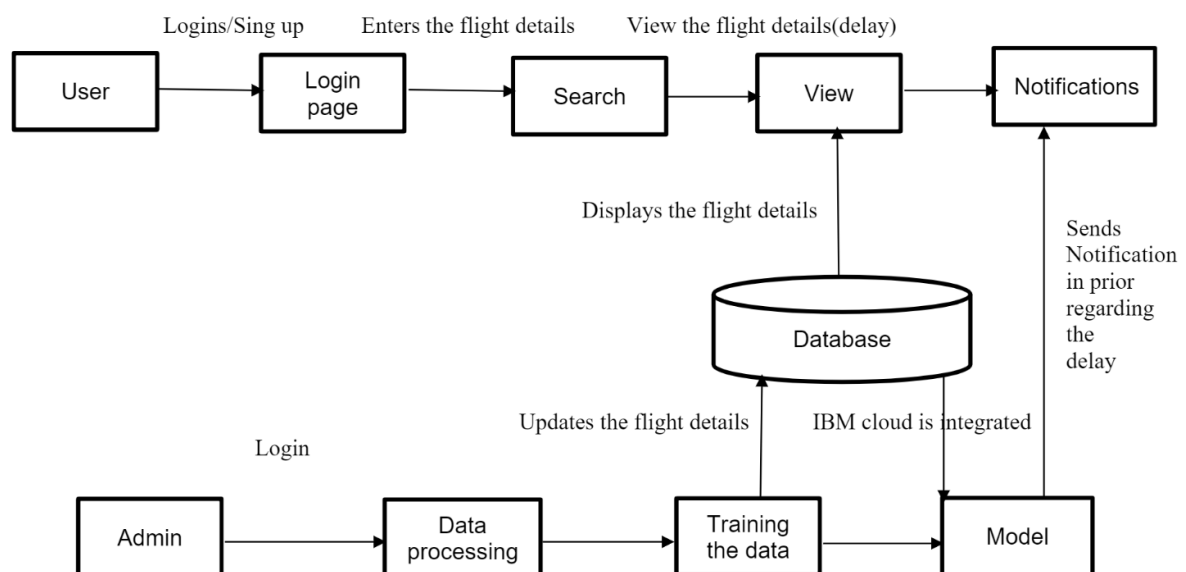
2.Non-functional Requirements:

FR No.	Non-Functional Requirement	Description
NFR-1	Usability	Web app is provided with smooth and user-friendly GUI.
NFR-2	Security	Data security of user is ensured with IBM Cloud secured login credentials.
NFR-3	Reliability	This web app have reliability by deploying in IBM Watson.
NFR-4	Performance	50 request per second is handled.
NFR-5	Availability	99% avail with the help of IBM Cloud.
NFR-6	Scalability	It had high scalability by having ability to extend the when request came.

V. Project Design:

1.Data Flow Diagrams

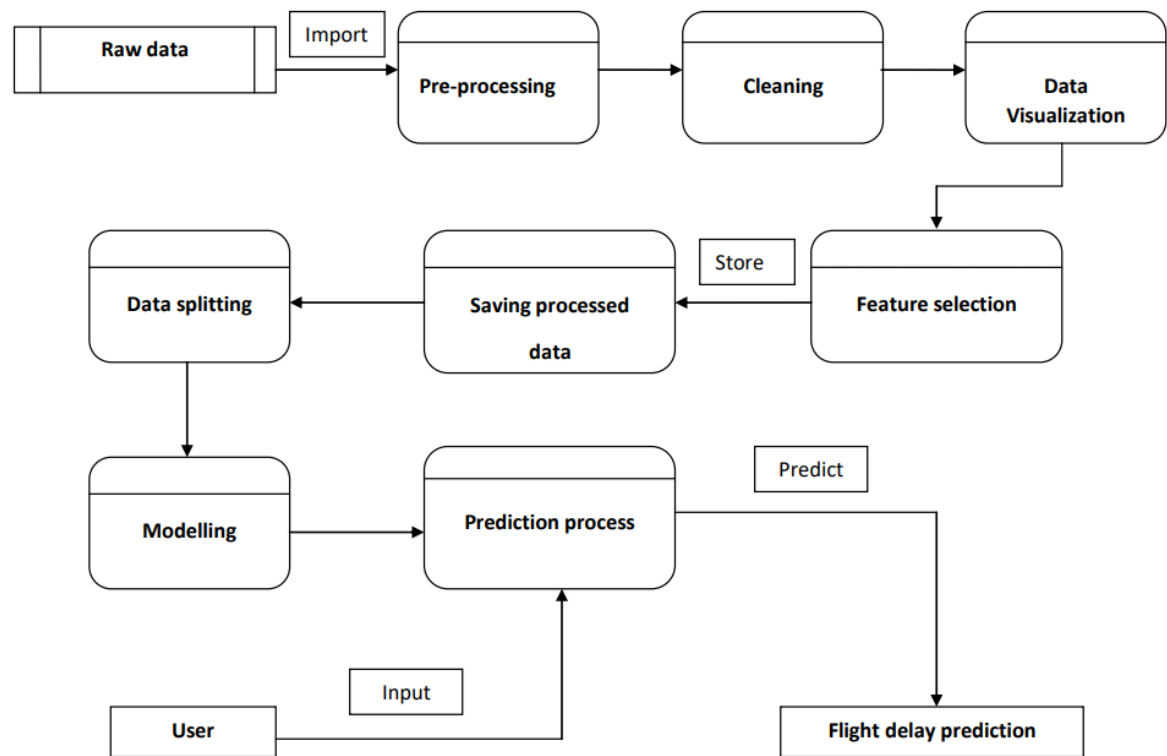
A Data Flow Diagram (DFD) is a traditional visual representation of the information flows within a system. A neat and clear DFD can depict the right amount of the system requirement graphically. It shows how data enters and leaves the system, what changes the information, and where data is stored.



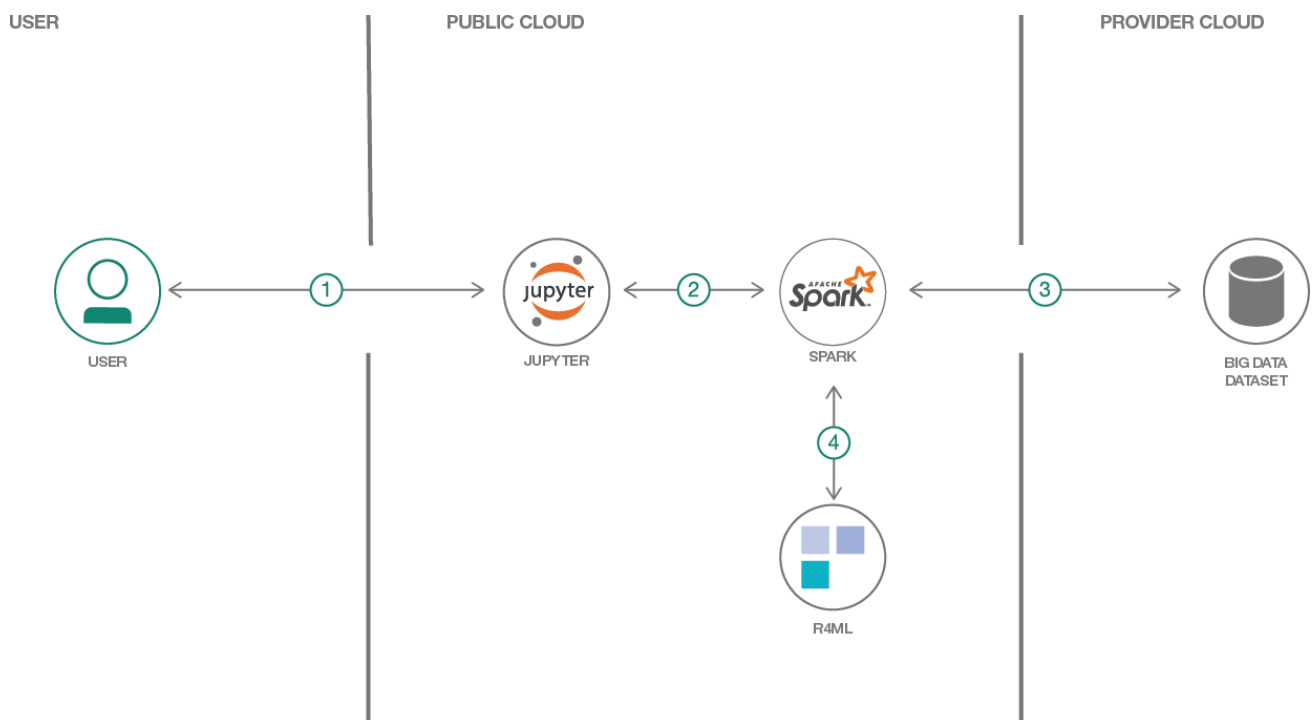
User Stories:

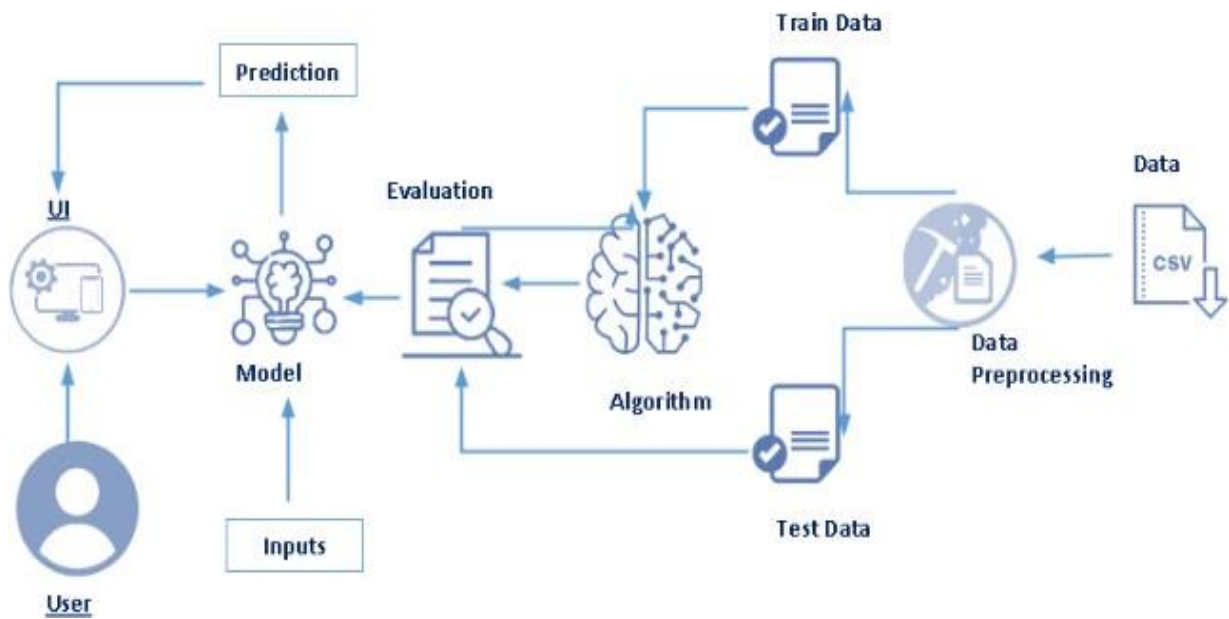
2. Solution & Technological Architecture

Solution Architecture



Technical Architecture





Application Characteristics:

S.No	Characteristics	Description	Technology
1.	Open-Source Frameworks	Flask, Scipy, Jupiter Notebook	microframework
2.	Scalable Architecture	3 – tier, Micro-services	Relational database, cloud, GUI
3.	Availability	distributed servers	IBM Cloud
4.	Performance	100 per sec	IBM Watson App Service

3.User Stories

User Type	Functional Requirement (Epic)	User Story Number	User Story / Task	Acceptance criteria	Priority	Release
Customer (Web user)	Registration	USN-1	As a user, I can register for the application by entering my email, password,	I can access my account / dashboard	High	Sprint-1

			and confirming my password.			
		USN-2	As a user, I will receive confirmation email once I have registered for the application	I can receive confirmation email & click confirm	High	Sprint-1

		USN-3	As a user, I can register for the application through Gmail	I can register and login by providing Gmail with access permissions	Medium	Sprint-2
	Login	USN-4	As a user, I can log into the application by entering email & password	I can login using my registered email and password(login credentials)	High	Sprint-1
	Dashboard	USN-5	As a user, I can access my dashboard which give way to provide data to predict flight delay	I can provide valid Input data	High	Sprint-2
	Logout	USN-6	As a user, I can logout by clicking logout button	I can logout my account from website	High	Sprint-1
	Prediction	USN-7	As a user, I can prediction result through dashboard by integratedML Model	I can get prediction by giving valid input	High	Sprint-3
Customer Care / support	Query/ complaint raise	USN-8	As a user, I can raise Query or complaint about technical issues	If raised query valid or true then resolve and response, else explain the missing understanding	Medium	Sprint-4
	Feedback/ rating	USN-9	As a user, I can give feedback and rating to the application	Support team accept the feedback , try to improve application	Medium	Sprint-4

Administrator	Maintain	USN-10	Administrator maintain the database and overall application	Punctual maintenance	High	Sprint-4
Developer	Testing	USN-11	As a developer, I test the application which I have developed	I test the application for checking errors and rectify it	High	Sprint- 1,2,3,4

VI. Project Planning & Scheduling

1.Sprint Planning & Estimation

Sprint	Functional Requirement (Epic)	User Story Number	User Story / Task	Story Points	Priority	Team Members
Sprint-1	Data Collection and Pre-processing	USN-1	As a user, I can't interact anything. Waiting is user's task. User can listen the relationship exist between the various attributes of data by presentation of developer	2	high	Arsah A
Sprint-1	Model Building	USN-2	As a user, I can predict flight delay by various developed ML models by console	1	high	Arsah A
Sprint-2	Model Evaluation	USN-3	As a user, I can predict flight delay by best Model in various developed ML model by console	2	high	Karolin Kiruba R
Sprint-2	Model Deployment on IBM Cloud using IBM Watson	USN-4	As a user, I can use the model by requesting the deployed model on Cloud	1	Medium	Karolin kiruba R

Sprint-2	Basic user interaction Dashboard	USN-5	As a user, I can use the model or prediction from model by interacting with dashboard	2	high	Karolin Kiruba R
Sprint-3	Improved Dashboard and GUI	USN-6	As a user, I can use the model or prediction from model by interacting with improved dashboard	1	Medium	Kishan I
Sprint-3	Registration	USN-7	As a user, I can register for the application by entering my email, password, and confirming my password.	2	High	Kishan I
Sprint-3	Registration	USN-7	As a user, I can register for the application by entering my email, password, and confirming my password.	2	High	Kishan I
Sprint-3	Login	USN-8	As a user, I can log into the application by entering email & password and I can register .login to the application through Gmail	2	Medium	Sri Jane A
Sprint-4	Raise query/complaint and give feedback	USN-9	As a user, I can raise complaint or query and give feedback	1	Medium	Neekitha C
Sprint-4	Improve overall web app	USN-10	As a user, I can user revised and improved version of web application	1	High	Neekitha C

2.Sprint Delivery Schedule

Sprint	Total Story Points	Duration	Sprint Start Date	Sprint End Date (Planned)	Story Points Completed (as on Planned End Date)	Sprint Release Date(Actual)
Sprint-1	20	6 Days	24 Oct 2022	29 Oct 2022	20	31 Oct 2022

Sprint-2	20	6 Days	31 Oct 2022	05 Nov 2022	20	07 Nov 2022
Sprint-3	20	6 Days	07 Nov 2022	12 Nov 2022	20	12 Nov 2022
Sprint-4	20	6 Days	14 Nov 2022	19 Nov 2022	20	19 Nov 2022

Velocity:

Imagine we have a 10-day sprint duration, and the velocity of the team is 20 (points per sprint). Let's calculate the team's average velocity (AV) per iteration unit (story points per day)

$$AV = \frac{\text{sprint duration}}{\text{velocity}} = \frac{20}{10} = 2$$

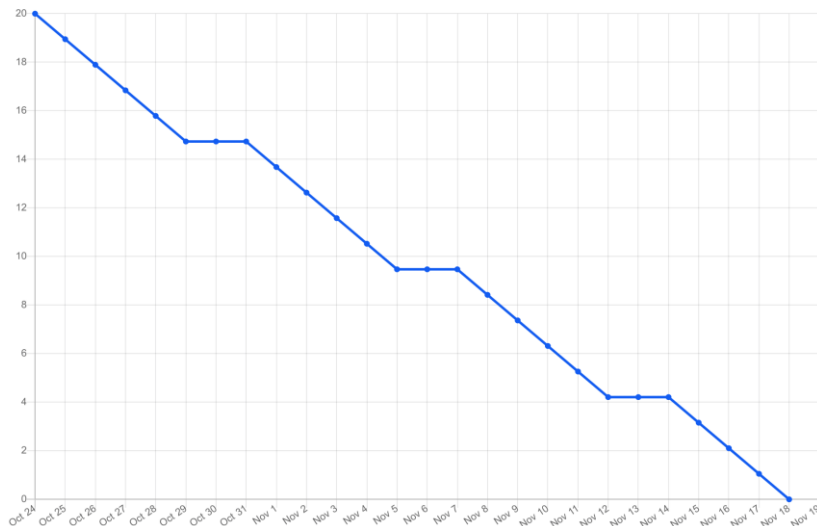
(Sprint – 1) Velocity = 3/20 = 0.15

(Sprint – 2) Velocity = 3/20 = 0.15

(Sprint – 3) Velocity = 7/20 = 0.35

(Sprint – 4) Velocity = 2/20 = 0.1

Burndown chart:



VII. Coding & Solutioning

SPRINT-1:

Outline:

1. Data Pre-processing
2. EDA/Data Analysis
3. Feature Engineering
4. Model Building
5. Saving Best Model

Required Libraries:

- Pandas - Data Pre-processing
- Numpy - Data Pre-processing, Analysis
- Matplotlib - Visualization
- Seaborn - Visualization
- Imblearn - Balancing Data
- Sklearn - Model Building
- Pickle - Model saving

Software/Tools:

- Anaconda – Jupyter Notebook
- Used Language Python

Data Pre-processing:

Data Collection:

Dataset is collected from the IBM career smartinternz portal in Guided Project.

Dataset description:

The dataset contains 31 variables with various data types such as string, object, time, integer, float.

Data columns (total 31 columns):

#	Column	Non-Null Count	Dtype
0	YEAR	11231 non-null	int64
1	QUARTER	11231 non-null	int64
2	MONTH	11231 non-null	int64
3	DAY_OF_MONTH	11231 non-null	int64
4	DAY_OF_WEEK	11231 non-null	int64
5	UNIQUE_CARRIER	11231 non-null	object
6	TAIL_NUM	11231 non-null	object
7	FL_NUM	11231 non-null	int64
8	ORIGIN_AIRPORT_ID	11231 non-null	int64
9	ORIGIN	11231 non-null	object
10	DEST_AIRPORT_ID	11231 non-null	int64
11	DEST	11231 non-null	object
12	CRS_DEP_TIME	11231 non-null	object
13	CRS_DEP_TIME.1	11231 non-null	int64
14	DEP_TIME	11124 non-null	object
15	DEP_TIME.1	11124 non-null	float64
16	DEP_DELAY	11124 non-null	float64
17	DEP_DEL15	11124 non-null	float64
18	CRS_ARR_TIME	11231 non-null	object
19	CRS_ARR_TIME.1	11231 non-null	int64
20	ARR_TIME	11116 non-null	object
21	ARR_TIME.1	11116 non-null	float64
22	ARR_DELAY	11043 non-null	float64
23	ARR_DEL15	11043 non-null	float64
24	CANCELLED	11231 non-null	int64
25	DIVERTED	11231 non-null	int64
26	CRS_ELAPSED_TIME1	11231 non-null	object
27	ACTUAL_ELAPSED_TIME1	11231 non-null	object
28	CRS_ELAPSED_TIME	11231 non-null	int64
29	ACTUAL_ELAPSED_TIME	11043 non-null	float64
30	DISTANCE	11231 non-null	int64dtypes: float64(7), int64(14), object(

Columns Description:

Dest means Destination Airport.

Crs_dep_time and crs_arr_time is planned departure and arrival time. Crs_elapsed_time is estimated travel time as per plan.

Arr_time and dep_time are actual arrival and departure time.Actual_elapsed_time is actual travelled time

To pre-process our dataset, we need to import above mentioned required libraries, then importdata using pandas.

This data does not contain any duplicated values and null values except in arrival , departuretime columns, because these left empty when flights are cancelled.

Descriptive Analytics:

data1.describe()

	QUARTER	MONTH	DAY_OF_MONTH	DAY_OF_WEEK	FL_NUM	CRS_DEP_TIME.1	DEP_DELAY	DEP_DEL15	CRS_ARR_TIME.1	ARR_DELAY	ARR_DEL15	CANCELLED	DIVERTED	CRS_ELAPSED_TIME	
count	11231.000000	11231.000000	11231.000000	11231.000000	11231.000000	11231.000000	11124.000000	11124.000000	11231.000000	11043.000000	11043.000000	11231.000000	11231.000000	11231.000000	11
mean	2.544475	6.628973	15.790758	3.960199	1334.325617	1320.798326	8.460266	0.142844	1537.312795	-2.573123	0.124513	0.010150	0.006589	190.652124	1
std	1.090701	3.354678	8.782056	1.995257	811.875227	490.737845	36.762969	0.349930	502.512494	39.232521	0.330181	0.100241	0.080908	78.386317	
min	1.000000	1.000000	1.000000	1.000000	7.000000	10.000000	-16.000000	0.000000	2.000000	-67.000000	0.000000	0.000000	0.000000	93.000000	
25%	2.000000	4.000000	8.000000	2.000000	624.000000	905.000000	-3.000000	0.000000	1130.000000	-19.000000	0.000000	0.000000	0.000000	127.000000	
50%	3.000000	7.000000	16.000000	4.000000	1267.000000	1320.000000	-1.000000	0.000000	1559.000000	-10.000000	0.000000	0.000000	0.000000	159.000000	
75%	3.000000	9.000000	23.000000	6.000000	2032.000000	1735.000000	4.000000	0.000000	1952.000000	1.000000	0.000000	0.000000	0.000000	255.000000	1
max	4.000000	12.000000	31.000000	7.000000	2853.000000	2359.000000	645.000000	1.000000	2359.000000	615.000000	1.000000	1.000000	1.000000	397.000000	2

In [147]: data1.describe()

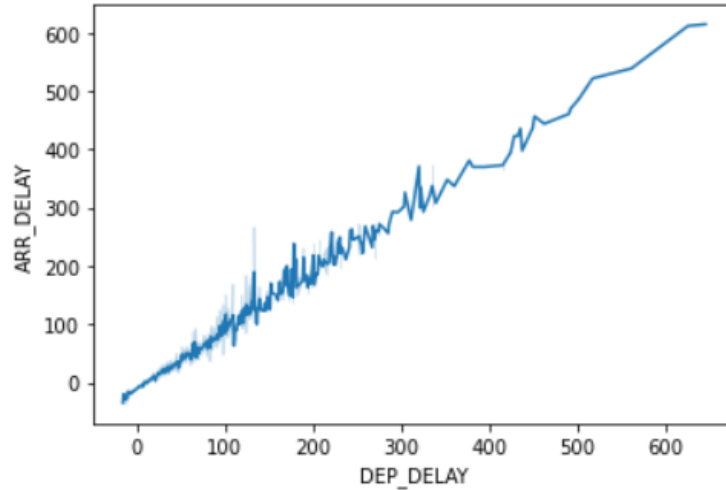
	QUARTER	MONTH	DAY_OF_MONTH	DAY_OF_WEEK	FL_NUM	CRS_DEP_TIME.1	DEP_DELAY	DEP_DEL15	CRS_ARR_TIME.1	ARR_DELAY	ARR_DEL15	CANCELLED	DIVERTED	CRS_ELAPSED_TIME	DISTANCE
count	11231.000000	11231.000000	11231.000000	11231.000000	11231.000000	11231.000000	11124.000000	11124.000000	11231.000000	11043.000000	11043.000000	11231.000000	11231.000000	11231.000000	11231.000000
mean	2.544475	6.628973	15.790758	3.960199	1334.325617	1320.798326	8.460266	0.142844	1537.312795	-2.573123	0.124513	0.010150	0.006589	190.652124	1161.031965
std	1.090701	3.354678	8.782056	1.995257	811.875227	490.737845	36.762969	0.349930	502.512494	39.232521	0.330181	0.100241	0.080908	78.386317	643.683379
min	1.000000	1.000000	1.000000	1.000000	7.000000	10.000000	-16.000000	0.000000	2.000000	-67.000000	0.000000	0.000000	0.000000	93.000000	509.000000
25%	2.000000	4.000000	8.000000	2.000000	624.000000	905.000000	-3.000000	0.000000	1130.000000	-19.000000	0.000000	0.000000	0.000000	127.000000	594.000000
50%	3.000000	7.000000	16.000000	4.000000	1267.000000	1320.000000	-1.000000	0.000000	1559.000000	-10.000000	0.000000	0.000000	0.000000	159.000000	907.000000
75%	3.000000	9.000000	23.000000	6.000000	2032.000000	1735.000000	4.000000	0.000000	1952.000000	1.000000	0.000000	0.000000	0.000000	255.000000	1927.000000
max	4.000000	12.000000	31.000000	7.000000	2853.000000	2359.000000	645.000000	1.000000	2359.000000	615.000000	1.000000	1.000000	1.000000	397.000000	2422.000000

Data Analysis and Visualisation:

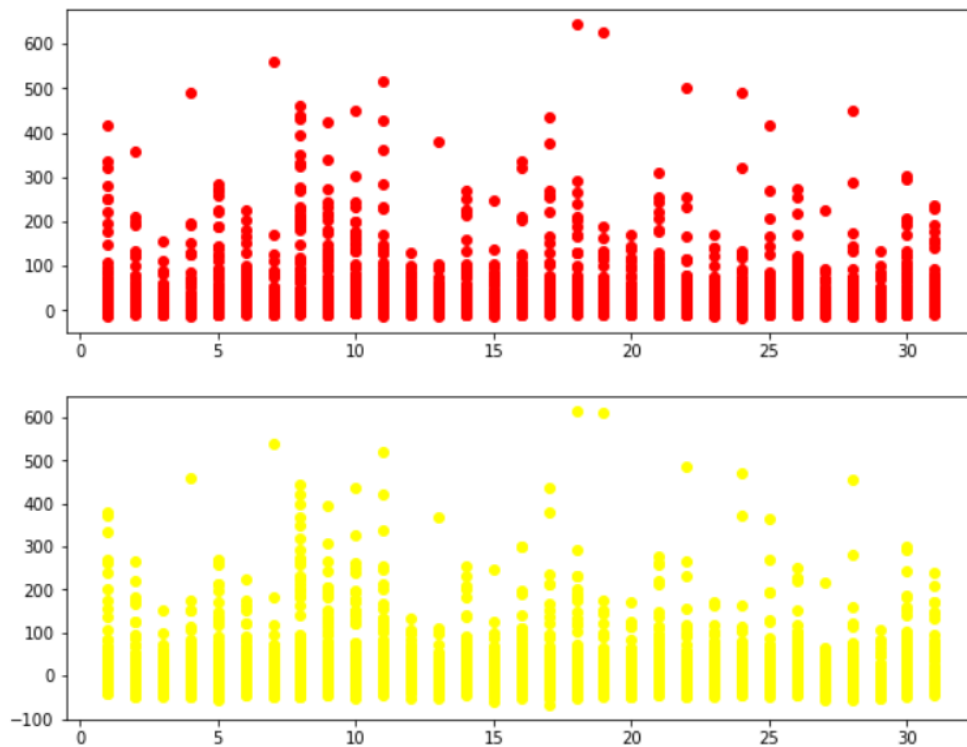
This graph shows the positive trend and strong binding between arrival and departure delay

```
sns.lineplot(x="DEP_DELAY",y="ARR_DELAY",data=data1)
```

```
<AxesSubplot:xlabel='DEP_DELAY', ylabel='ARR_DELAY'>
```

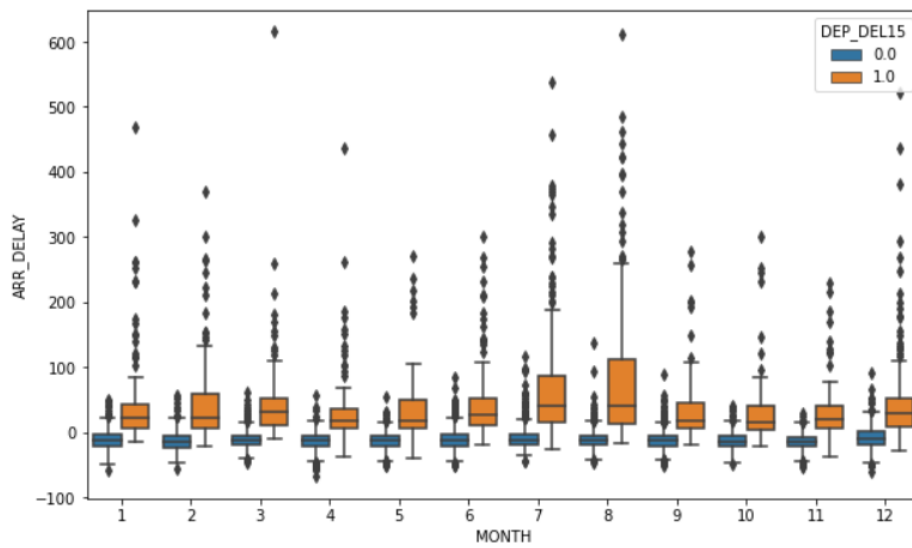


```
plt.figure(figsize=(10,8))
plt.subplot(2,1,1)
plt.scatter(data1["DAY_OF_MONTH"],data1["DEP_DELAY"],color="red")
plt.subplot(2,1,2)
plt.scatter(data1["DAY_OF_MONTH"],data1["ARR_DELAY"],color="yellow")
plt.show()
```



```
plt.figure(figsize=(10,6))
sns.boxplot(x="MONTH",y="ARR_DELAY",data=data1,hue="DEP_DEL15")
```

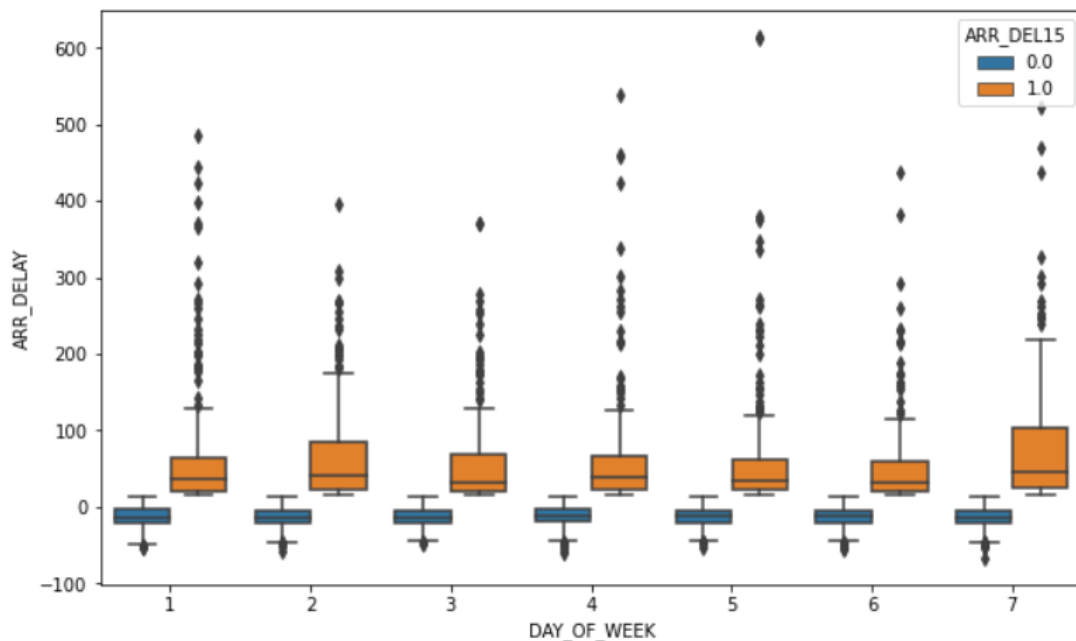
<AxesSubplot:xlabel='MONTH', ylabel='ARR_DELAY'>



This above picture shows the relationship between day of month and delays

```
plt.figure(figsize=(10,6))
sns.boxplot(x="DAY_OF_WEEK",y="ARR_DELAY",data=data1,hue="ARR_DEL15")
```

<AxesSubplot:xlabel='DAY_OF_WEEK', ylabel='ARR_DELAY'>

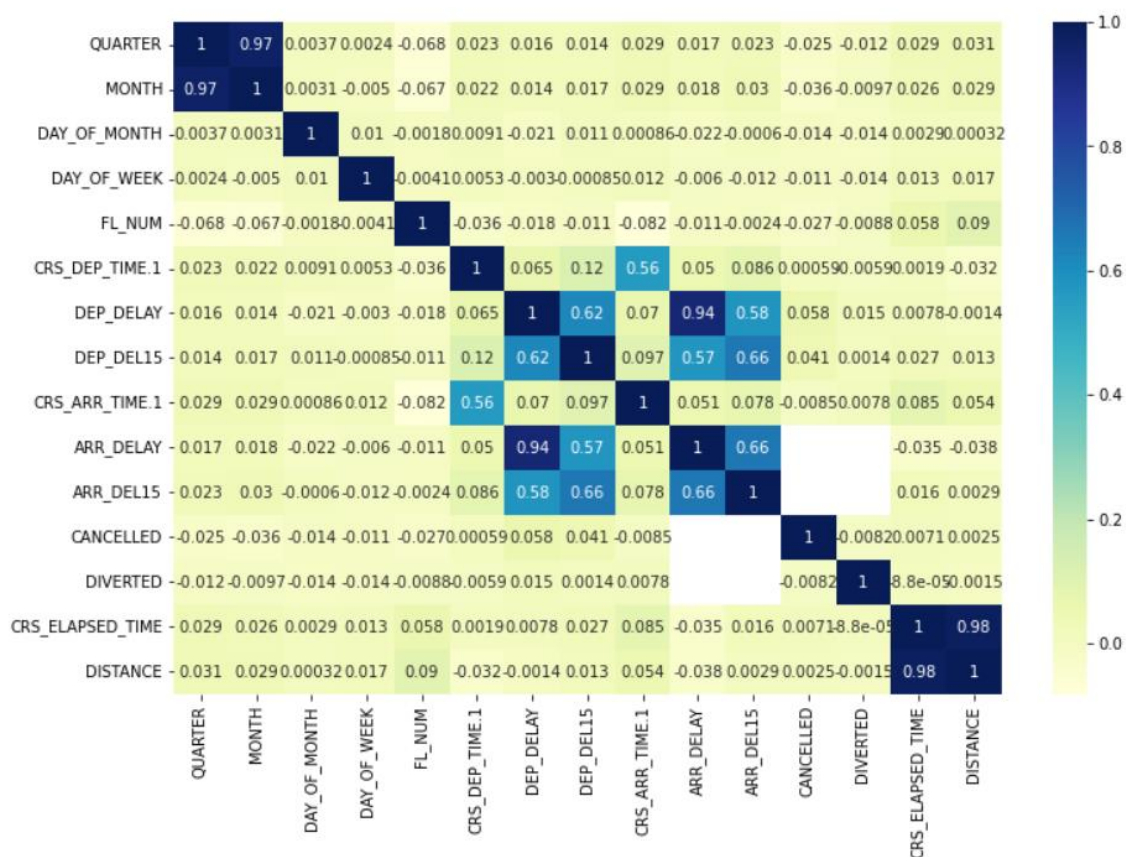


This above boxplot shows the trends of days of the week and delay, Monday and Saturday had high delays.

Correlation between columns:

```
... plt.figure(figsize=(12,8))
sns.heatmap(data1.corr(),cmap="YlGnBu",annot=True)
```

```
] : <AxesSubplot:>
```



Feature Engineering:

We engineered Season from the month according to the analysis

```
In [25]: data1.groupby(by="DAY_OF_WEEK")["DEP_DEL15"].sum()
```

```
Out[25]: DAY_OF_WEEK
1      253.0
2      213.0
3      204.0
4      245.0
5      250.0
6      198.0
7      226.0
Name: DEP_DEL15, dtype: float64
```

```
In [26]: data1.groupby(by="MONTH")["DEP_DEL15"].sum()
```

```
Out[26]: MONTH
1      113.0
2      115.0
3      104.0
4      96.0
5      86.0
6      168.0
7      219.0
8      246.0
9      88.0
10     86.0
11     66.0
12     202.0
Name: DEP_DEL15, dtype: float64
```

Then Engineered NDELAY column from the summary of ARR_DEL15, DEP_DEL15, CANCELLED, DIVERTED columns.

Splitted NDELAY as dependnr column and others independent columns after removing unnecessary columns

Data Balancing:

We balanced our using SMOTE technique which works based on KNN principle.

Balancing Dataset Using SMOTE Technique

```
In [48]: from imblearn.combine import SMOTETomek
smote=SMOTETomek(sampling_strategy={1:2000,2:2000,3:400,4:700},random_state=42)
x1,y2=smote.fit_resample(x,y)
y2.value_counts()

Out[48]: 0.0    8316
         1.0    1537
         2.0    1493
         4.0     634
         3.0     340
         Name: NDELAY, dtype: int64
```

Encoding Categorical columns into numerical columns:

We encoded ORGIN ,DEST into numerical columns.

Model Buliding:

We builded

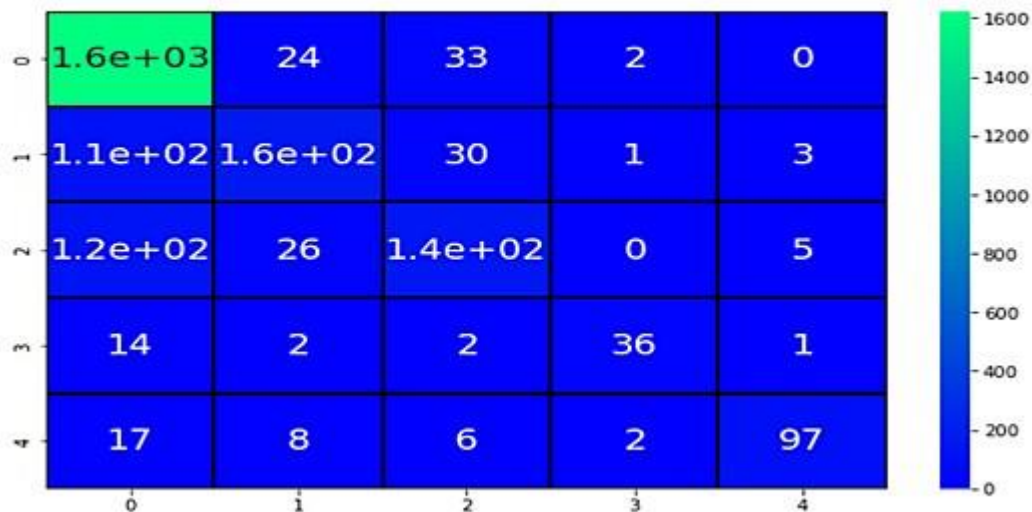
Decision Tree with 0.7536525974025974 Random Forest with 0.8368506493506493 SVM with 0.6128246753246753

KNN with 0.7280844155844156

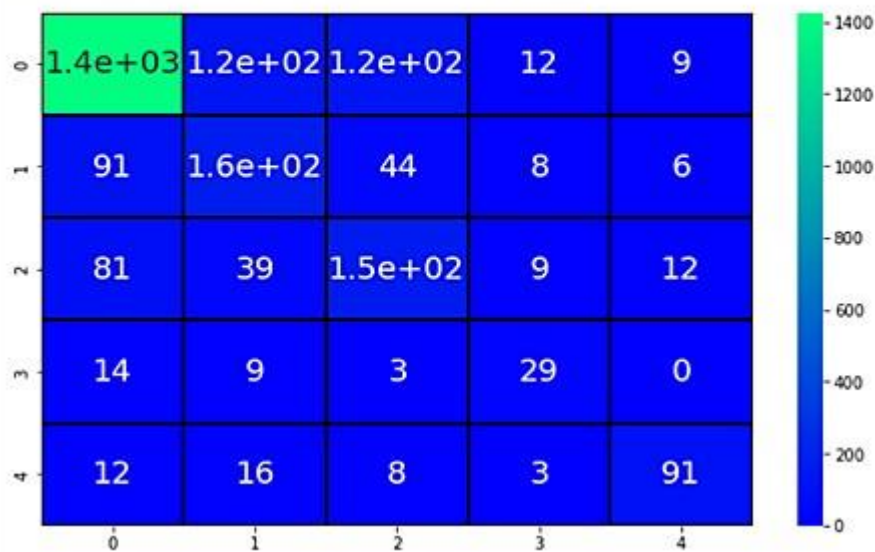
Logistic Regession with 0.6830357142857143

We will explore only Random Forest and Decision Tree which have high accuracy Random Forest

Testing Sensitivity for Random Forest 0.9360230547550432
 Testing Specificity for Random Forest 0.8716577540106952
 Testing Precision for Random Forest 0.9854368932038835
 Testing accuracy for Random Forest 0.8368506493506493



Testing Accuracy for Decision Tree 0.8849804578447794
 Testing Sensitivity for Decision Tree 0.9400131839156229
 Testing Specificity for Decision Tree 0.5802919708029197
 Testing Precision for Decision Tree 0.9253731343283582
 Testing accuracy for Decision Tree 0.7516233766233766



Model Saving:

Random Forest gives the best accuracy then others , so we save random forest model using pickle.

```
In [71]: import pickle
```

```
In [72]: pickle.dump(rf,open("rfmodel.pkl",'wb'))
```

Conclusion:

In this sprint , we build our model , evaluated and saved. In next sprint, we deploy our model IBM cloud using IBM Watson and building Dashboard.

SPRINT-2:

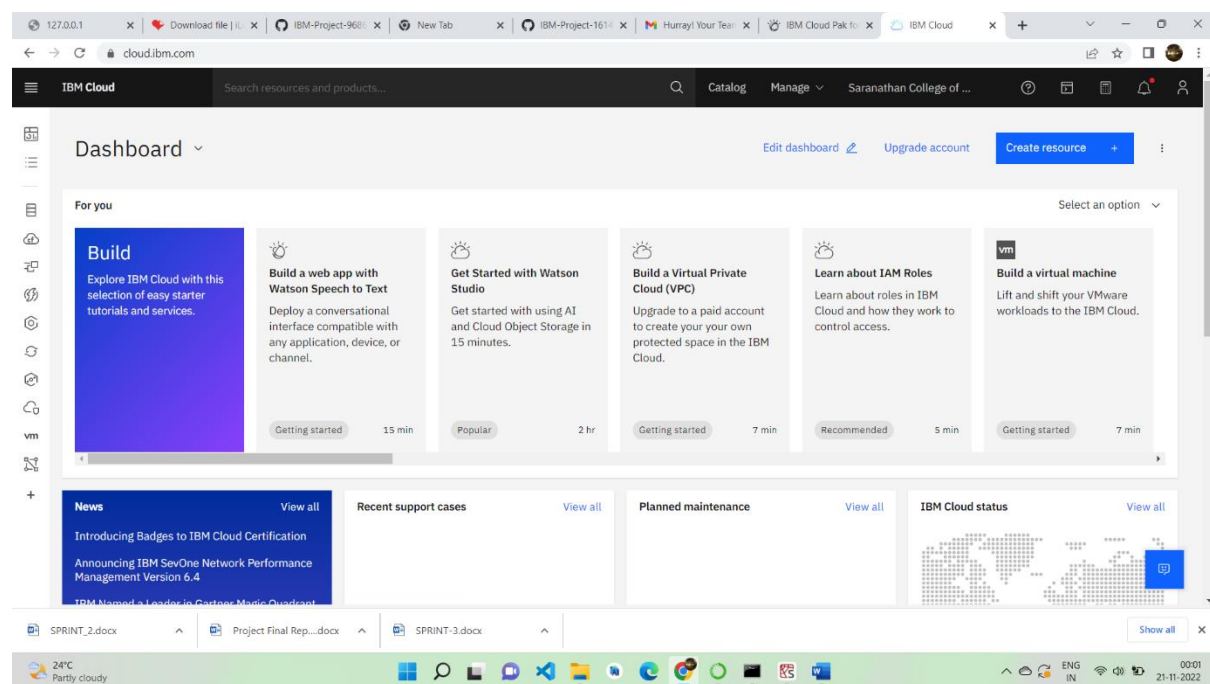
- **Creating IBM cloud account & Required Resources**
- **Deploy our model in IBM Watson**
- **Creating Dashboard using HTML/CSS**
- **Create web app and Hosting in falsk**
- **Testing web app**

Creating IBM cloud account & Required Resources:

Creating IBM cloud account:

Frist, need to create IBM Cloud account by using SI Mail Id and SI Password which is provided by IBMin profile.

Below dashboard of an account after created,



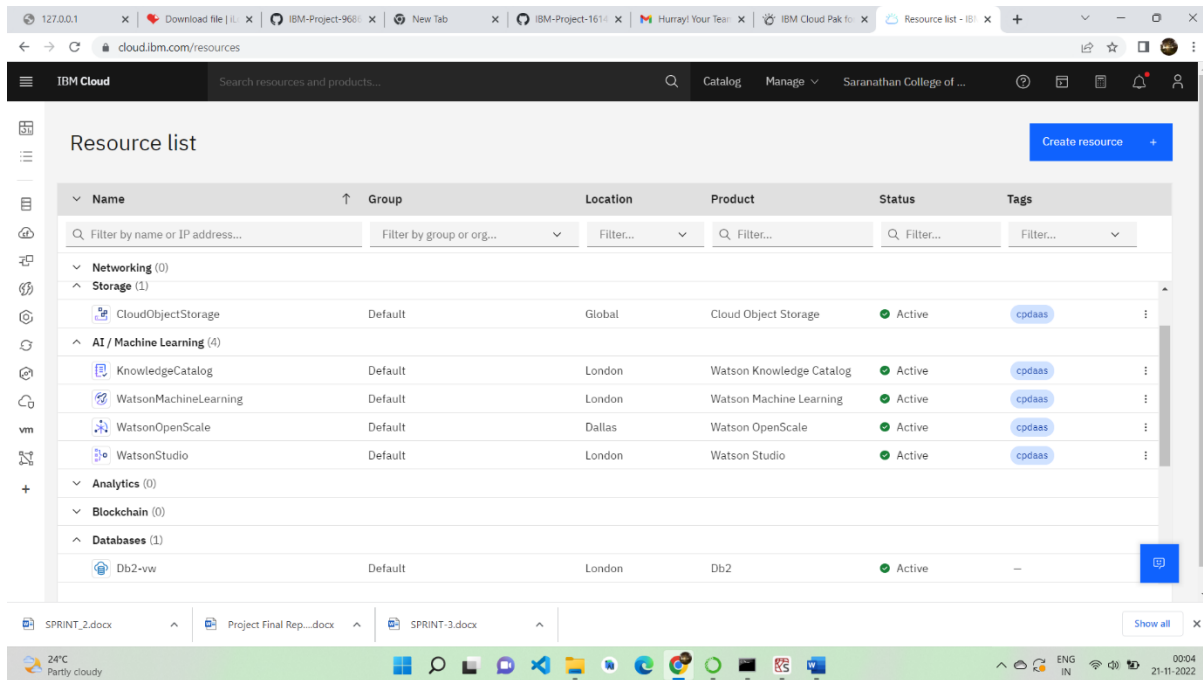
Creating IBM Cloud Required Resources:

After creating IBM cloud account, to deploy ML model, need to create following resources such as,
Cloud Object Storage

Watson Machine Learning

Watson Studio

After created above resources Resource List of an account is displayed as follow,



All the resource are in active state.

All the required cloud resources are created successfully.

Deploy our model in IBM Watson:

To deploy ML model in IBM cloud, need to create project in IBM Watson. After successful creation of project import .ipynb file of sprint-1 which ML models are build in Jupyter notebook.

Upload required datasets and import it. Deploy model using following code,

```
!pip install -U ibm-watson-machine-learning
```

```
from ibm_watson_machine_learning import APIClient
```

```
import json
```

```
import numpy as npwml_cred={
```

```
"apikey": "IF-dWY9BFLrCPxwHr1kyXWh9AVRL4G4aDElRzF9TsYu6"
```

```
", "url": "https://eu-gb.ml.cloud.ibm.com"
```

```
}
```

```
wml_clients=APIClient(wml_cred)wml_clients.spaces.list()
```

```
space_id="6d7c1218-3aca-4256-be3d-d610732530b1" wml_clients.set.default_space(space_id)
```

```
wml_clients.software_specifications.list(500) MODEL_NAME="randomforest"
```

```
DEPLOYMENT_NAME="rf_deployment"
```

```
DEMO_MODEL=rf
```

```
soft_sepc_id=wml_clients.software_specifications.get_id_by_name("runtime-22.1-py3.9")
```

```
model_props={ wml_clients.repository.ModelMetaNames.NAME:MODEL_NAME,
               wml_clients.repository.ModelMetaNames.TYPE:"scikit-learn_1.0",
               wml_clients.repository.ModelMetaNames.SOFTWARE_SPEC_UID: soft_sepc_id
```

```
}
```

NOTE: APIKey must need to create to deploy and connect API

After successful of deployment, deployed is appeared in Deployment section as follow,

127.0.0.1 x Download file (1) x IBM-Project-968 x New Tab x IBM-Project-1614 x Hurray! Your Team x IBM Cloud Pak for Data x IBM Cloud x

eu-gb.dataplatform.cloud.ibm.com/ml-runtime/spaces?context=cpdaas

IBM Cloud Pak for Data Search in your workspaces Buy Saranathan College of Engi... London AA

Deployments

2 spaces

New deployment space +

Activity Spaces

Filter by: All spaces Which deployment space are you looking for?

Name	Last modified	Your role	Collaborators	Tags	Online deployments	Jobs
model	Nov 20, 2022, 8:25 PM	Admin	AA		5	0
deployment	Nov 20, 2022, 4:56 PM	Admin	AA		0	0

SPRINT_2.docx Project Final Rep...docx SPRINT-3.docx Show all

24°C Partly cloudy Windows Taskbar

127.0.0.1 x Download file (1) x IBM-Project-968 x New Tab x IBM-Project-1614 x Hurray! Your Team x IBM Cloud Pak for Data x Resource list - IBM x

eu-gb.dataplatform.cloud.ibm.com/ml-runtime/models/131188aa-82ea-4111-9434-0bd4b1ba9781?space_id=0e35a1c8-fc26-4a0f-a7ba-2096e25022cf&context=cpdaas

IBM Cloud Pak for Data Search in your workspaces Buy Saranathan College of Engi... London AA

Deployments / model /

randomforest

Deployments Model details

New deployment +

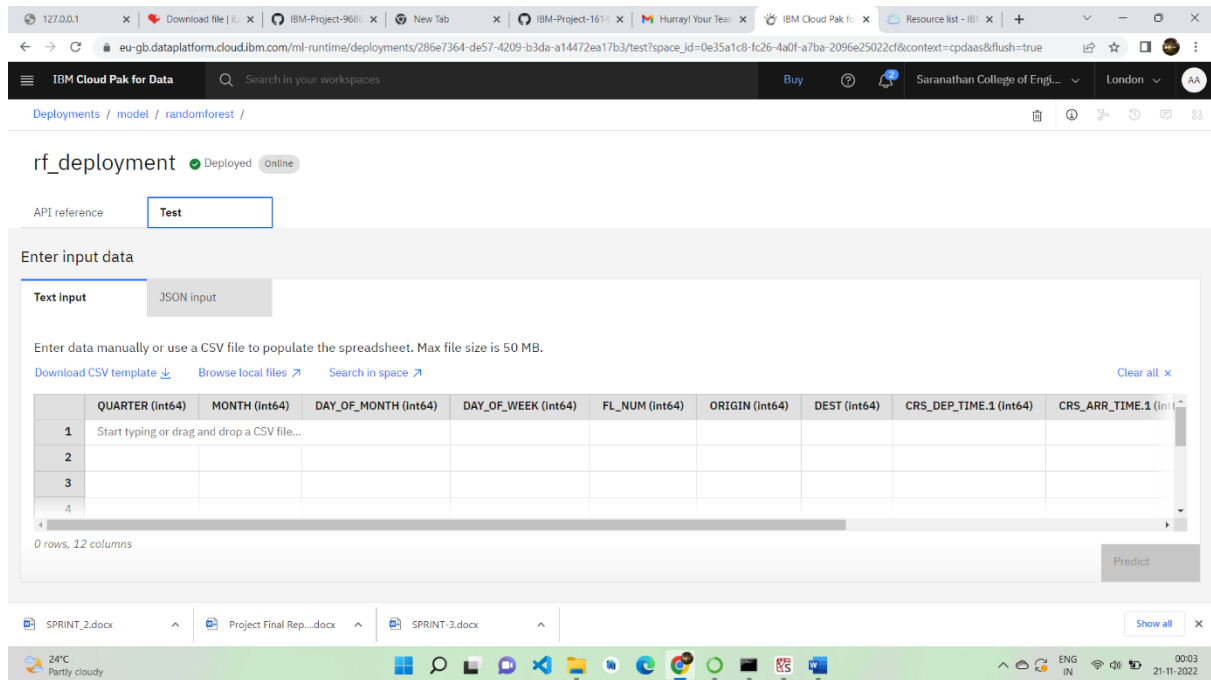
DEPLOYMENT TYPES

3 Online Deployment(s)

	Name	Status	Last modified
Online (3)	rf_deployment	Deployed	Nov 20, 2022, 8:47 PM
Batch (0)	rf_deployment	Deployed	Nov 20, 2022, 8:47 PM
	rf_deployment	Deployed	Nov 20, 2022, 8:46 PM

SPRINT_2.docx Project Final Rep...docx SPRINT-3.docx Show all

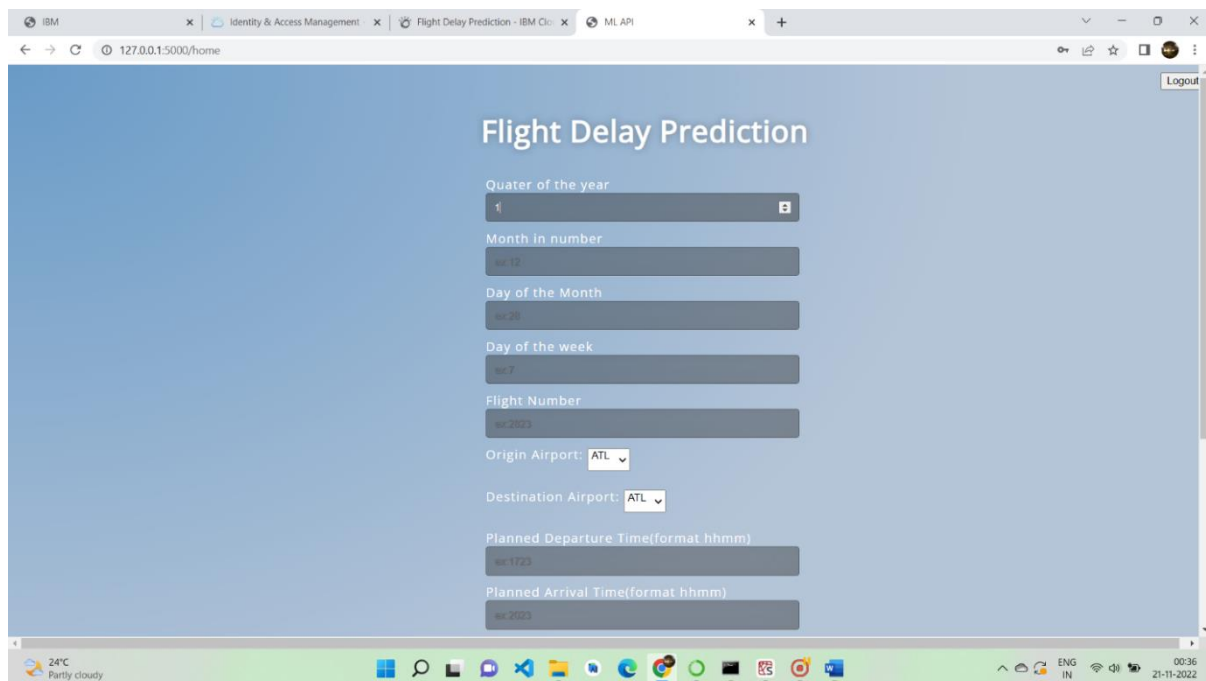
24°C Partly cloudy Windows Taskbar



After these, need to copy API requesting codes on required language(python).

Creating Dashboard using HTML/CSS:

Frontend Dashboard is created using HTML/CSS, Result as web page like,

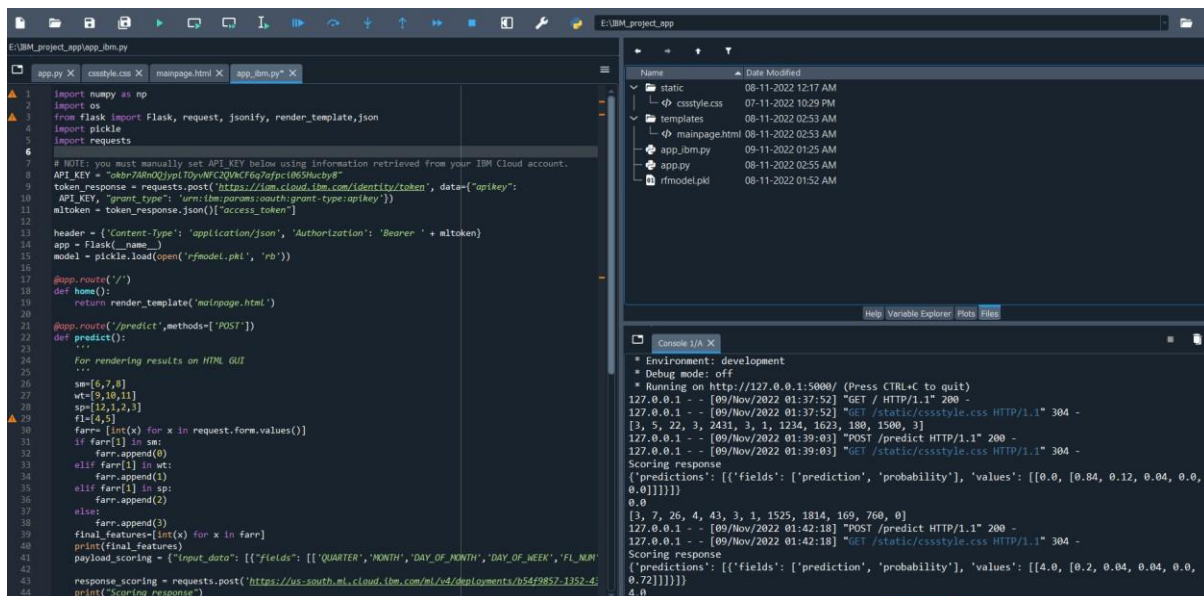


Create web app and Hosting in falsk:

First thing, need to create directory as follow,

Name	Date Modified
static	08-11-2022 12:17 AM
└─ cssstyle.css	07-11-2022 10:29 PM
templates	08-11-2022 02:53 AM
└─ mainpage.html	08-11-2022 02:53 AM
app_ibm.py	09-11-2022 01:25 AM
app.py	08-11-2022 02:55 AM
rfmodel.pkl	08-11-2022 01:52 AM

Then, code the required logic in app.py file with API connection , request and response code.Spyder IDE looks like,



```
1 import numpy as np
2 import os
3 from flask import Flask, request, jsonify, render_template, json
4 import pickle
5 import requests
6
7 # NOTE: you must manually set API_KEY below using information retrieved from your IBM Cloud account.
8 API_KEY = "d8b274b0d3p1DyW4WfC2QWkCF6g7zfpclm5hucby8"
9 token_response = requests.post("https://iam.cloud.ibm.com/identity/token", data={"apikey":
10 API_KEY, "grant_type": 'urn:ibm:params:oauth:grant-type:apikey'})
11 mltoken = token_response.json()["access_token"]
12
13 header = {'Content-Type': 'application/json', 'Authorization': 'Bearer ' + mltoken}
14 app = Flask(__name__)
15 model = pickle.load(open('rfmodel.pkl', 'rb'))
16
17 @app.route('/')
18 def home():
19     return render_template('mainpage.html')
20
21 @app.route('/predict', methods=['POST'])
22 def predict():
23     ...
24     For rendering results on HTML GUI
25     ...
26     sm=[5,7,8]
27     wt=[9,10,11]
28     sp=[12,1,3,3]
29     fl=[4,5]
30     farr=[int(x) for x in request.form.values()]
31     if farr[1] in sm:
32         farr.append(0)
33     elif farr[1] in wt:
34         farr.append(1)
35     elif farr[1] in sp:
36         farr.append(2)
37     else:
38         farr.append(3)
39     final_features=[int(x) for x in farr]
40     print(final_features)
41     payload_scoring = {"input_data": [{"fields": [{"QUARTER", "MONTH", "DAY_OF_MONTH", "DAY_OF_WEEK", "FL_NUM"}
42     response_scoring = requests.post("https://us-south.ml.cloud.ibm.com/ml/v4/deployments/b54f9857-1352-4f
43     print("Scoring response")
```

Console output:

```
* Environment: development
* Debug mode: off
* Running on http://127.0.0.1:5000/ (Press CTRL+C to quit)
127.0.0.1 - - [09/Nov/2022 01:37:52] "GET / HTTP/1.1" 200 -
127.0.0.1 - - [09/Nov/2022 01:37:52] "GET /static/cssstyle.css HTTP/1.1" 304 -
127.0.0.1 - - [09/Nov/2022 01:39:03] "POST /predict HTTP/1.1" 200 -
127.0.0.1 - - [09/Nov/2022 01:39:03] "GET /static/cssstyle.css HTTP/1.1" 304 -
Scoring response
{'predictions': [{'fields': ['prediction', 'probability'], 'values': [[0.0, [0.84, 0.12, 0.04, 0.0, 0.0]]]]}]
0.0
[3, 7, 26, 4, 43, 3, 1, 1525, 1814, 169, 760, 0]
127.0.0.1 - - [09/Nov/2022 01:42:18] "POST /predict HTTP/1.1" 200 -
127.0.0.1 - - [09/Nov/2022 01:42:18] "GET /static/cssstyle.css HTTP/1.1" 304 -
Scoring response
{'predictions': [{'fields': ['prediction', 'probability'], 'values': [[4.0, [0.2, 0.04, 0.04, 0.0, 0.72]]]]}]
4.0
```

Run the app.py file.

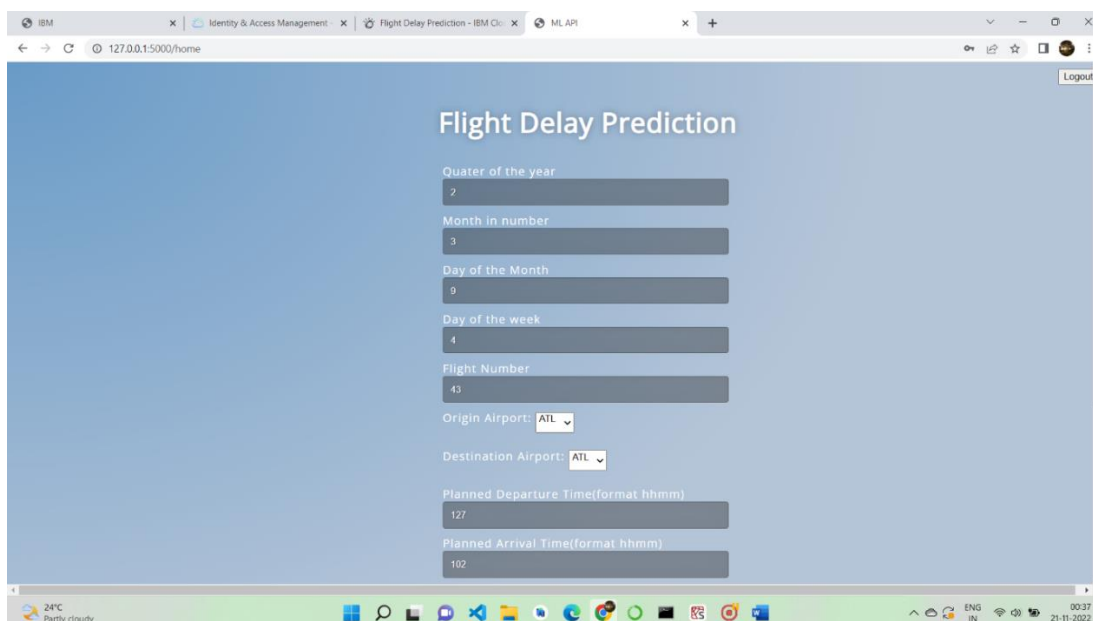
Localhost url is displayed in console, copy and paste in browser then search it , frond end HTML?CSS page is displayed. Successfully created and hosted web app in flask.

If any error caused as flask in production mode, thenSet FLASK_ENV=Development,

Then run the app

VIII.Testing web app

Enter the data on the required fields,



Flight Delay Prediction

Quarter of the year
2

Month in number
3

Day of the Month
9

Day of the week
4

Flight Number
43

Origin Airport: ATL

Destination Airport: ATL

Planned Departure Time(format h:mm)

127

Planned Arrival Time(format h:mm)

102

IBM Identity & Access Management - x Flight Delay Prediction - IBM Cloud ML API

127.0.0.1:5000/home

3

Day of the Month

9

Day of the week

4

Flight Number

43

Origin Airport: ATL

Destination Airport: ATL

Planned Departure Time(format hhmm)

127

Planned Arrival Time(format hhmm)

102

Estimated Traveling Time(in minutes)

40

Distance(in Kms)

161

Predict

24°C Partly cloudy 00:37 21-11-2022

Output is predicted by ML model successfully.

IBM Identity & Access Management - x Flight Delay Prediction - IBM Cloud ML API

127.0.0.1:5000/predict

Logout

here is a chance to both departure and arrival delay will happen 2.0

Prediction dashboard

we are happy with your visit of our website and looking for your feedback to improve our website further.You can give your feedback through below feedback button Or if you feel any inconvenience , raise your complaint using complaint button

Feedback

Complaint

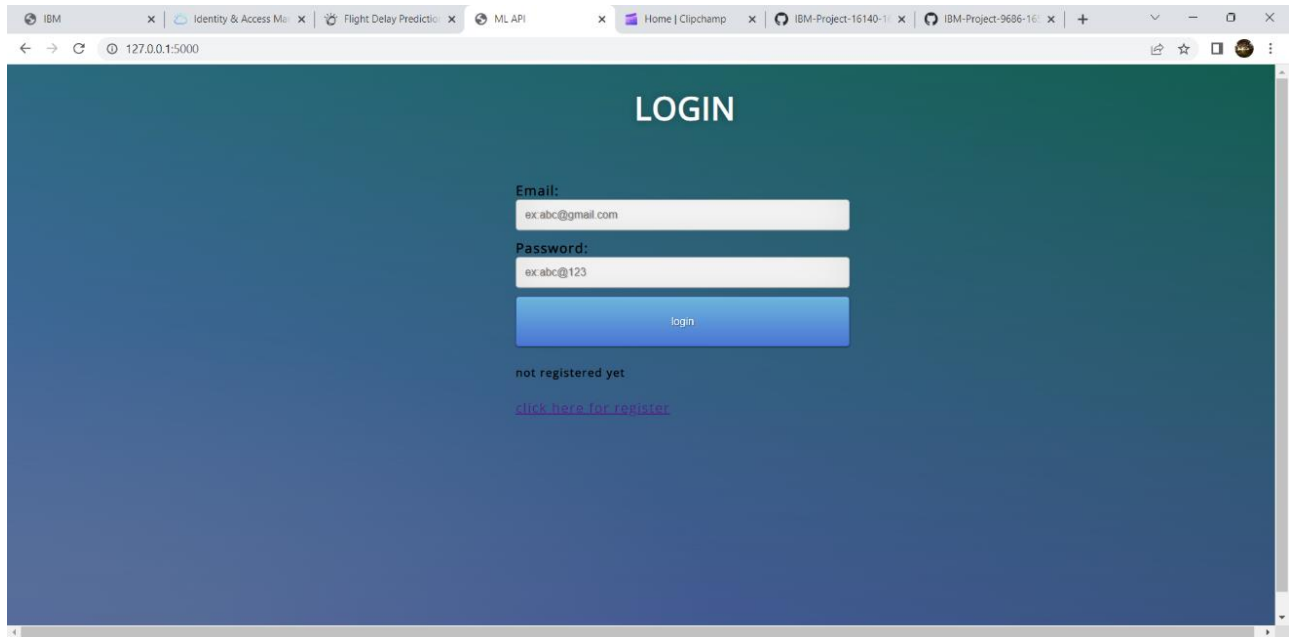
24°C Partly cloudy 00:38 21-11-2022

SPRINT-3:

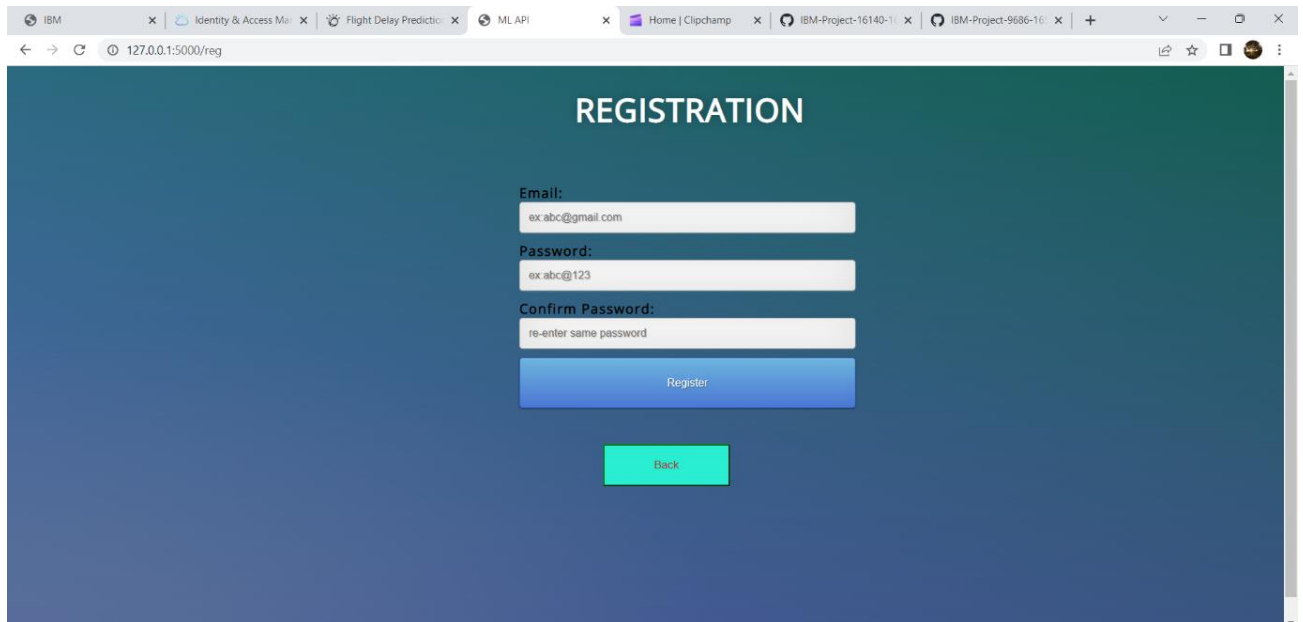
- Build templates of login and register pages
- Connect templates and login, register operation in flaskTest run the app

Build templates of login and register pages:

Using, HTML/CSS , Login and register templates are build



Above picture shows the login page of this app.



Above picture is register page of web app.

Connect templates and login, register operation in flask:

There is a need to connect database for store and retrieve user details. In this project SQLite3 database is used to store and retrieve user details.

Login code as follow:

```
@app.route('/')def main():
    return render_template('login.html')
@app.route('/login',methods=['POST','GET'])def login():
    if request.method=='POST':try:
        fv=[x for x in request.form.values()] email=request.form["email"] pswd=request.form["pswd"]
        conn=sqlite3.connect("database1.db")cur=conn.cursor()
        cur.execute("SELECT password FROM login WHERE email=?",(str(email),))result=cur.fetchone()
        cur.execute("SELECT * FROM login")if result:
            if result[0]==pswd:
                flash("login successfully",'success')return redirect('/home')
            else:
                return render_template("login.html", error="please enter correct password")
        else:
            print("register")
            flash("please Register",'danger')
            return redirect('/reg')
    except Exception as e:return "hello error"
```

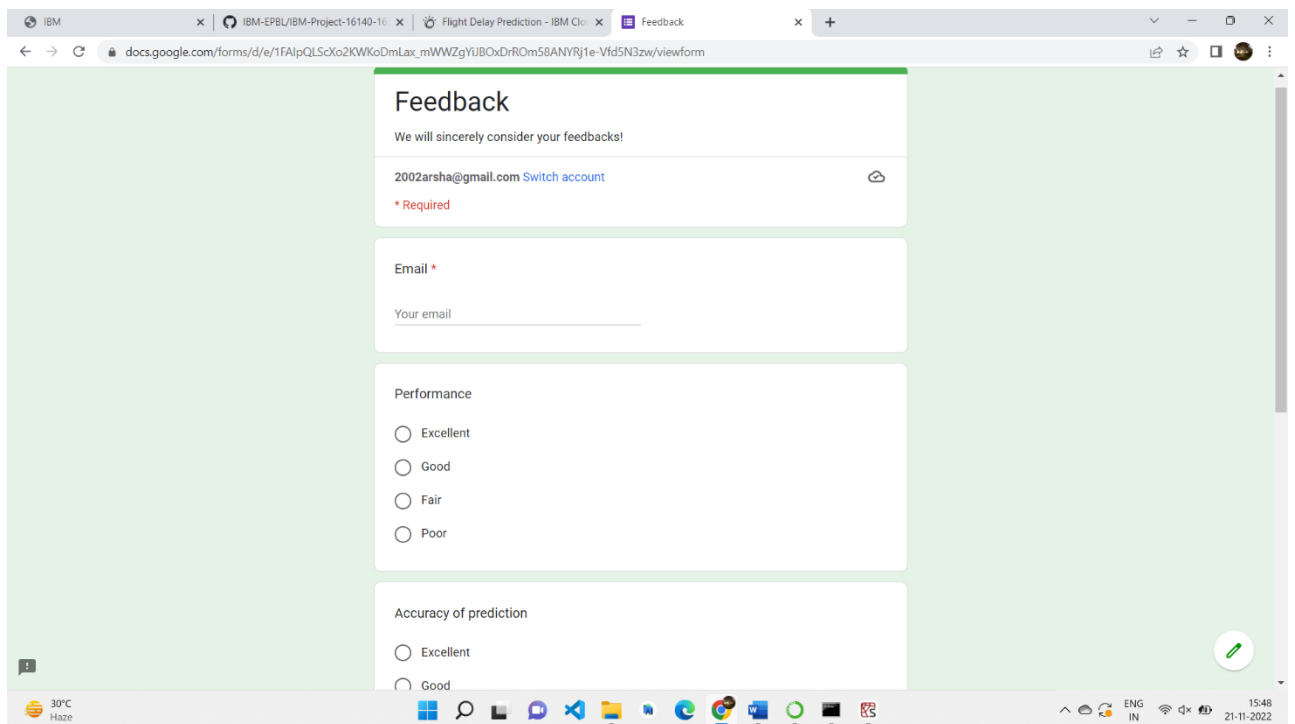
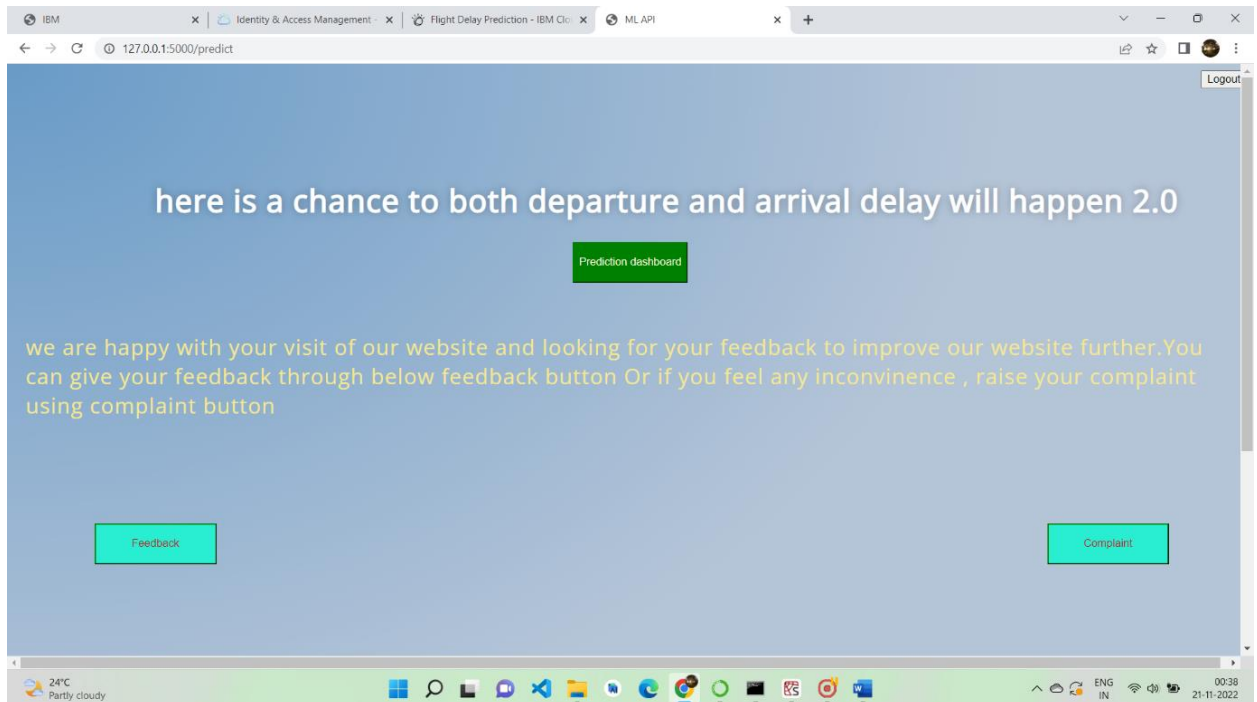
Register code as follow:

```
.route('/reg')def reg():
    return render_template("register.html")
@app.route('/register',methods=['POST','GET']) def register():
    if request.method=='POST':try:
        fv=[x for x in request.form.values()] email=request.form["email"] pswd=request.form["pswd"]
        conn=sqlite3.connect("database1.db")cur=conn.cursor()
        cur.execute("SELECT * FROM login WHERE email=?",(str(email),))result=cur.fetchone()
        if result:
            flash("user already exist,please login",'danger')return redirect('/')
        else:
            cur.execute("INSERT INTO login(email,password)values(?,?)",(str(email),str(pswd)))
            conn.commit()
            cur.execute("SELECT * FROM login") flash("Registered successfully",'success')return
            render_template('login.html')
    except Exception as e: print(e) #flash(e,'danger') return "hello error1"
```

By using above code, successfully connect login and register pages to app successfully.

SPRINT-4

Result page added,



IBM

IBM-EPBL/IBM-Project-16140-16

Flight Delay Prediction - IBM Clou

Suggestion

docs.google.com/forms/d/e/1FAIpQLSe2pqn32PtGxiwBKOIP1r3ktKgQp-1Pv5UBdotfPx7LFbzg/viewform

Suggestion

2002arsha@gmail.com [Switch account](#)

* Required

Email *

Your email

Complains or Suggestion will help us enhance our application and service

Your answer

Submit

Clear form

Never submit passwords through Google Forms.

This content is neither created nor endorsed by Google. [Report Abuse](#) - [Terms of Service](#) - [Privacy Policy](#)

Google Forms

30°C Haze

ENG IN

15:48

21-11-2022

1.Test Cases

Test case ID	Feature Type	Component	Test Scenario	Pre-Requisite	Steps To Execute	Test Data	Expected Result	Actual Result	Status	Comments	TC for Automation(Y/N)	BUG ID	Executed
LoginPage_TC_001	Functional	Login/register Page	Verify user is able to see the Login/Signup when user register and login	any latest version browser	1.Enter URL and click go 2. click register link 3. enter your credentials 4. click register 5. Verify login/Signup	1. Email id 2. Password	1. If Login successful redirect to prediction page 2. Signup successful redirect to login page with register successful message	Working as expected	Pass	good			Team ID:PNT2022T127
LoginPage_TC_002	Functional	login page	Verify user is able to log into application with Valid credentials	any latest version browser	1.Enter URL and click go 2. Enter Valid email in Email text box 3. Enter valid password in password text box 4. Click on login button	1. Email id 2. Password	User should navigate to prediction page	Working as expected	Pass	good			Team ID:PNT2022T128
LoginPage_TC_004	Functional	Login page	Verify user is able to log into application with Invalid credentials	any latest version browser	1.Enter URL and click go 2. Enter Valid email in Email text box 3. Enter invalid password in password text box 4. Click on login button	1. Email id 2. invalid Password	Application should show 'password' validation message	Working as expected	Pass	good			Team ID:PNT2022T129
LoginPage_TC_005	Functional	Login page	Verify user is able to log into application with Invalid credentials	any latest version browser	1.Enter URL and click go 2. Enter invalid or new email in Email text box 3. Enter valid password in password text box 4. Click on login button	1. in valid or new Email id 2. Password	Application should redirect to register page with user not exist message	Working as expected	Pass	good			Team ID:PNT2022T129
RegisterPage_TC_002	Functional	register page	Verify user is able to log into application with Invalid credentials	any latest version browser	1.Enter URL and click go 2. go to register 3. Enter already registered email in Email text box 4. Click on register button	1. already registered Email id 2. Password	Application should redirect to loginpage with user already exist message.	Working as expected	Pass	good			Team ID:PNT2022T131
prediction Page_TC_001	Functional	prediction page	Verify user is able to get prediction with valid input	any latest version browser	1.Enter URL and click go 2. login with valid user credentials 3. click login 3.in prediction page, enter valid input data 4. Click on predict button	1. valid Email id 2. password Password 3. valid input data	User should navigate to result page and get prediction	Working as expected	Pass	good			Team ID:PNT2022T132
prediction Page_TC_002	Functional	prediction page	Verify user is able warnings on try predict with Invalid input data	any latest version browser	1.Enter URL and click go 2. login with valid user credentials 3. click login 3.in prediction page, enter invalid input data like month greater than 12 or negative values, week days greater than 7, quarter greater than 4, invalid distance and time) 4. Click on predict button	1. valid Email id 2. password Password 3. invalid input data	user able to get warnings like month greater than 12 or negative values, week days greater than 7, quarter greater than 4, invalid distance and time)	Working as expected	Pass	good			Team ID:PNT2022T133
result Page_TC_001	UI	result page	Verify user is able to see prediction with other UI components like prediction page button/feedback and complaint button	any latest version browser	1.Enter URL and click go 2. login with valid user credentials 3. click login 3.in prediction page, enter valid input data 4. Click on predict button	1. valid Email id 2. password Password 3. valid input data	User should navigate to result page and get prediction , able to see other ui components	Working as expected	Pass	good			Team ID:PNT2022T134
result Page_TC_002	functional	result page	Verify user is able to go back prediction page , go to feedback or complaint form with UI components like prediction page button/feedback and complaint button	any latest version browser	1.Enter URL and click go 2. login with valid user credentials 3. click login 3.in prediction page, enter valid input data 4. Click on predict button 5. click on prediction page button 6. click feedback or complaint button	1. valid Email id 2. password Password 3. valid input data	User should navigate to result page and get prediction , able to use other ui components	Working as expected	Pass	good			Team ID:PNT2022T134

2.User Acceptance Test

1.Purpose of Document

The purpose of this document is to briefly explain the test coverage and open issues of the Developing a flight delay prediction model using machine learning project at the time of the release to User Acceptance Testing (UAT).

2.Defect Analysis

This report shows the number of resolved or closed bugs at each severity level, and howthey were resolved

Resolution	Severity 1	Severity 2	Severity 3	Severity 4	Subtotal
By Design	8	4	2	3	15
Duplicate	0	0	0	0	0
External	2	1	0	1	4
Fixed	15	10	4	5	34
Not Reproduced	0	0	0	0	0
Skipped	0	0	0	0	0
Won't Fix	0	0	0	0	0
Totals	23	15	6	9	53

3.Test Case Analysis

This report shows the number of test cases that have passed, failed, and untested

Section	Total Cases	Not Tested	Fail	Pass
Client Application	12	0	0	12
Security	2	0	0	2
Exception Reporting	6	0	0	6
Final Report Output	4	0	0	4

IX. Results

1.Performance Metrics

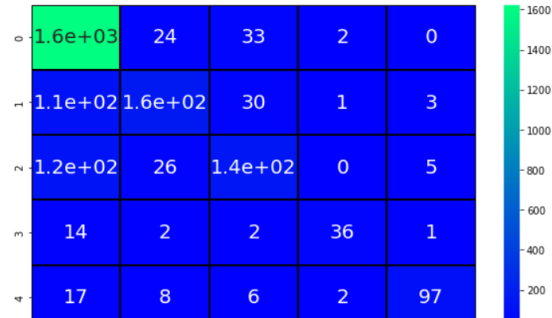
1

Metrics

Classification Model:
Confusion Matrix –
Accuray Score-
& Classification Report

```
from sklearn.metrics import confusion_matrix, accuracy_score, classification_report
pred=rf.predict(x_test)
cm=confusion_matrix(y_test, pred)
plt.figure(figsize=(10,6))
sns.heatmap(cm, annot=True, cmap='winter', linewidths=0.3, linecolor='black', annot_kws={"size": 20})
TP=cm[0][0]
TN=cm[1][1]
FN=cm[1][0]
FP=cm[0][1]
#print(round(accuracy_score(prediction3,y_test)*100,2))
#print('Testing Accuracy for knn',(TP+TN)/(TP+TN+FN+FP))
print('Testing Sensitivity for Random Forest',(TP/(TP+FN)))
print('Testing Specificity for Random Forest',(TN/(TN+FP)))
print('Testing Precision for Random Forest',(TP/(TP+FP)))
print('Testing accuracy for Random Forest',accuracy_score(y_test, pred))
```

Testing Sensitivity for Random Forest 0.9360230547550432
Testing Specificity for Random Forest 0.8716577540106952
Testing Precision for Random Forest 0.9854368932038835
Testing accuracy for Random Forest 0.8368506493506493

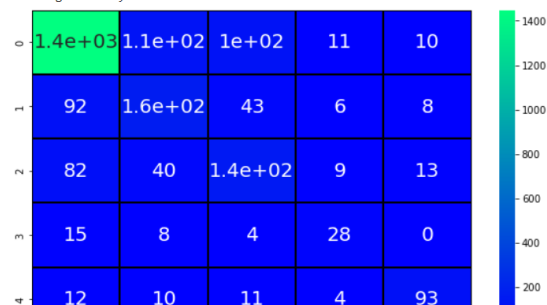


```
print(classification_report(y_test,pred))#RandomForest
```

	precision	recall	f1-score	support
0.0	0.86	0.96	0.91	1683
1.0	0.73	0.53	0.61	308
2.0	0.67	0.49	0.57	288
3.0	0.88	0.65	0.75	55
4.0	0.92	0.75	0.82	130
accuracy			0.84	2464
macro avg	0.81	0.68	0.73	2464
weighted avg	0.83	0.84	0.83	2464

```
pred1=dc.predict(x_test)
cm1=confusion_matrix(y_test, pred1)
plt.figure(figsize=(10,6))
sns.heatmap(cm1, annot=True, cmap='winter', linewidths=0.3, linecolor='black', annot_kws={"size": 20})
TP=cm1[0][0]
TN=cm1[1][1]
FN=cm1[1][0]
FP=cm1[0][1]
#print(round(accuracy_score(prediction3,y_test)*100,2))
print('Testing Accuracy for Decision Tree',(TP+TN)/(TP+TN+FN+FP))
print('Testing Sensitivity for Decision Tree',(TP/(TP+FN)))
print('Testing Specificity for Decision Tree',(TN/(TN+FP)))
print('Testing Precision for Decision Tree',(TP/(TP+FP)))
print('Testing accuracy for Decision Tree',accuracy_score(y_test, pred1))
```

Testing Accuracy for Decision Tree 0.8878453038674033
Testing Sensitivity for Decision Tree 0.9402597402597402
Testing Specificity for Decision Tree 0.5888888888888889
Testing Precision for Decision Tree 0.9288005131494548
Testing accuracy for Decision Tree 0.7597402597402597



```
print(classification_report(y_test,pred1))
```

	precision	recall	f1-score	support
0.0	0.88	0.86	0.87	1683
1.0	0.48	0.52	0.50	308
2.0	0.47	0.50	0.49	288
3.0	0.48	0.51	0.50	55
4.0	0.75	0.72	0.73	130
accuracy			0.76	2464
macro avg	0.61	0.62	0.62	2464
weighted avg	0.77	0.76	0.76	2464

2

Tune the Model

Hyperparameter Tuning - Validation Method -

```
Out[77]: {'criterion': 'entropy',
          'max_depth': 7,
          'max_leaf_nodes': 9,
          'random_state': 42}
```

click to scroll output: double click to hide

```
In [76]: cv_result=cross_val_score(rf,x_train,y_train,cv=skf)
cv_result
```

```
Out[76]: array([0.81135903, 0.80974125, 0.8021309 , 0.81836631, 0.81887367])
```

```
In [74]: from sklearn.model_selection import KFold,GridSearchCV,cross_val_score
kf= KFold(n_splits=5,shuffle=True,random_state=42)
param={
    'max_depth':[4,5,7,9,11],
    'max_leaf_nodes':[5,6,8,9],
    'random_state':[42,56,72],
    'criterion':['gini','entropy','log_loss']
}
```

```
In [77]: grcv=GridSearchCV(rf,param,cv=skf)
grcv.fit(x_train,y_train)
grcv.best_param_
```

2.Advantages & disadvantages

Advantages:

- Early known of delay will reduce the tension, pressure of customer, airlinesand airport authorities.
- By early known of delay, we can reduce or avoid financial loss
- We can change our plan according to the practical scenario, if we know thedelay earlier
- Airlines and Airport Authorities make prevention techniques, find the sourceof the problem
- Airlines can inform their passengers to prepare according to that. This savesname and fame the airlines among the modern society

Disadvantage:

- Delay due to unexpected climate change , war, natural disaster.. etc can't predict exactly

- Need more data and analyse

3.Conclusion

Successfully developed the flight delay prediction model using random forest algorithm which gives best accuracy. By knowing delay earlier, many chance to avoid, so many problems and issues. This prediction gives the warning only to make prepared us.

4.Future Scope

Add the feature to track the flight on real time and make prediction using realtime data by connecting to the private API which gives real time data

5.Appendix

Source code

Mainpage.html

```
<!DOCTYPE html>
<html >

<head>
  <meta charset="UTF-8">
  <title>ML API</title>
  <link href='https://fonts.googleapis.com/css?family=Pacifico' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Arimo' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Hind:300' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Open+Sans+Condensed:300' rel='stylesheet'
  type='text/css'>
  <link rel="stylesheet" href="{{ url_for('static',filename='cssstyle.css')}}">

</head>

<body style = "background-color:darkgreen;">
<div class="logout" style="display : flex;
flex-direction: row-reverse";
>
<a href="{{ url_for('main')}}"><button>Logout</button></a>
</div>
<h1 class="h1">Flight Delay Prediction</h1>

<div class="login">

  <!-- Main Input For Receiving Query to our ML -->
  <form action="{{ url_for('predict')}}" method="post">
```

```

    Quarter of the year <input type="number" name="quater" placeholder="ex:3"
required="required" min='1' max='4' />
    Month in number<input type="number" name="month" placeholder="ex:12"
required="required" min='1' max='12'/>
    Day of the Month<input type="number" name="daym" placeholder="ex:28"
required="required" min='1' max='31'/>
    Day of the week<input type="number" name="dayw" placeholder="ex:7"
required="required" min='1' max='7'/>
    Flight Number<input type="number" name="fnum" placeholder="ex:2823"
required="required" max="9999"/>

    Origin Airport: <select name="airport" class="origin">
<option value='1'>ATL</option>
<option value='2'>DWT</option>
<option value='3'>JFK</option>
<option value='4'>MSP</option>
<option value='5'>SEA</option>
</select><br><br>
    Destination Airport: <select name="airportd" class="dest">
<option value='1'>ATL</option>
<option value='2'>DWT</option>
<option value='3'>JFK</option>
<option value='4'>MSP</option>
<option value='5'>SEA</option>
</select><br><br>
    Planned Departure Time(format hhmm)<input type="number" name="dtime"
placeholder="ex:1723" required="required" max="9999"/>
    Planned Arrival Time(format hhmm)<input type="number" name="atime"
placeholder="ex:2023" required="required" max="9999"/>
    Estimated Traveling Time(in munites)<input type="number" name="ttime"
placeholder="ex:180" required="required" max="9999"/>
    Distance(in Kms)<input type="number" name="distance" placeholder="ex:2500"
required="required" min='140' max="99999"/>
    <button type="submit" class="btn btn-primary btn-block">Predict</button>
</form>

<br>
<br>
<br>

</div>

</body>
</html>

```

Login.html

```

<!DOCTYPE html>
<html>

<head>

```



```

<meta charset="UTF-8">
<title>ML API</title>
<link href='https://fonts.googleapis.com/css?family=Pacifico' rel='stylesheet' type='text/css'>
<link href='https://fonts.googleapis.com/css?family=Arimo' rel='stylesheet' type='text/css'>
<link href='https://fonts.googleapis.com/css?family=Hind:300' rel='stylesheet' type='text/css'>
<link href='https://fonts.googleapis.com/css?family=Open+Sans+Condensed:300' rel='stylesheet'
type='text/css'>
<link rel="stylesheet" href="{{ url_for('static',filename='Lcssstyle.css')}}">

</head>
<body style = "background-color:darkgreen;">
<h1 class="h1">LOGIN</h1>
<div class="login">
    <form action="{{ url_for('login')}}" method="post">
        <h4 style="color:#a60c2f"> {{ alert }}</h4><h4 style="color:green"> {{ message }}</h4>
        Email: <input type="email" name="email" placeholder="ex:abc@gmail.com"
required="required" autocomplete />
        Password: <input type="password" name="pswd" id="pswd" placeholder="ex:abc@123"
required="required" maxlength=15/>
            {{ error }}
            <span id="error" style="color:#F00;"> </span>
        <button type="submit" class="btn btn-primary btn-block" id="lbtn">login</button>
        <h5>not registered yet </h5><a href="{{ url_for('reg')}}">click here for register</a>
    </form>

    <br>
    <br>
</div>
</body>
</html>

```

Register.html

```

<!DOCTYPE html>
<html >

<head>
    <meta charset="UTF-8">
    <title>ML API</title>
    <link href='https://fonts.googleapis.com/css?family=Pacifico' rel='stylesheet' type='text/css'>
    <link href='https://fonts.googleapis.com/css?family=Arimo' rel='stylesheet' type='text/css'>
    <link href='https://fonts.googleapis.com/css?family=Hind:300' rel='stylesheet' type='text/css'>
    <link href='https://fonts.googleapis.com/css?family=Open+Sans+Condensed:300' rel='stylesheet'
type='text/css'>
    <link rel="stylesheet" href='{{ url_for('static',filename='Lcssstyle.css')}}'>

</head>

```

```

<script>

function confirmPass() {
    var pass = document.getElementById("pswd").value
    var confPass = document.getElementById("cpswd").value
    if(pass != confPass) {
        //alert('Wrong confirm password !');
        document.getElementById('error').innerHTML='wrong confirm password';
        document.getElementById('rbtn').disabled=true;
    }
    else
    {
        document.getElementById('error').innerHTML="";
        document.getElementById('rbtn').disabled=false;
    }
}
//function hello()
//{
// console.log("Hellow world");

</script>
<body style = "background-color:darkgreen;">
<h1 class="h1">REGISTRATION</h1>
<div class="register">
    <h4 style="color:red"> {{ alert }} </h4>
    <form action="{{ url_for('register') }}" method="post">
        Email: <input type="email" name="email" placeholder="ex:abc@gmail.com"
required="required" autocomplete />
        Password: <input type="password" name="pswd" id="pswd" placeholder="ex:abc@123"
required="required" maxlength=15/>
        Confirm Password:<input type="password" name="cpswd" id="cpswd"
placeholder="re-enter same password" required="required" oninput="confirmPass()" />
        <span id="error" style="color:#F00;"> </span>
        <button type="submit" class="btn btn-primary btn-block" id="rbtn">Register</button>
    </form>
    <br>
    <br>
<a href="{{ url_for('main') }}"><button style="color:brown; background-color:#29eed1;
border-color:green; height:50px;width:150px;position:relative;
margin-left:100px">Back</button></a>
    <br>
    <br>

</div>

</body>
</html>

```

Result.html

```
<html >

<head>
  <meta charset="UTF-8">
  <title>ML API</title>
  <link href='https://fonts.googleapis.com/css?family=Pacifico' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Arimo' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Hind:300' rel='stylesheet' type='text/css'>
  <link href='https://fonts.googleapis.com/css?family=Open+Sans+Condensed:300' rel='stylesheet'
  type='text/css'>
  <link rel="stylesheet" href="{{ url_for('static',filename='cssstyle.css')}} ">

</head>

<body style = "background-color:darkgreen;">
<div class="logout" style="display : flex;
flex-direction: row-reverse";
>
<a href="{{ url_for('main')}} "><button>Logout</button></a>
</div>
<br>
  <br>
  <br>
  <br>

<h1 class="h1" style="text-align:center-left">{{ prediction_text }}</h1>

<div class='prediction' style="display: flex; justify-content:center; height:70px;">

  <a href="{{ url_for('home')}} "><button style="color:#f5f5dc; background-color:green;border-
color:green; height:50px">Prediction dashboard</button></a>
  </div>
  <p style="color:#f7e98e; padding:15px;font-size:26px">we are happy with your visit of
our website and looking for your feedback to improve our website further.You can give your
feedback through below
  feedback button Or if you feel any inconvenience , raise your complaint using complaint
button </p>
  <br>
  <br>
  <br>
  <br>
  <a href="https://forms.gle/S2QXJtpeDdwXCuMk6"><button style="color:brown; background-
color:#29eed1;
border-color:green; height:50px;width:150px;position:relative;
margin-left:100px">Feedback</button></a>
  <a href="https://forms.gle/hiWgMKHgMVj2CnQ48"><button style="color:brown;
background-color:#29eed1;
border-color:green; height:50px;width:150px;
position:relative;
```

left:67%">Complaint</button>

</body>

</html>

Csstyle.css

```
@import url(https://fonts.googleapis.com/css?family=Open+Sans);
.btn { display: inline-block; *display: inline; *zoom: 1; padding: 4px 10px 4px; margin-bottom: 0; font-size: 13px; line-height: 18px; color: #333333; text-align: center; text-shadow: 0 1px 1px rgba(255, 255, 255, 0.75); vertical-align: middle; background-color: #f5f5f5; background-image: -moz-linear-gradient(top, #ffffff, #e6e6e6); background-image: -ms-linear-gradient(top, #ffffff, #e6e6e6); background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#ffffff), to(#e6e6e6)); background-image: -webkit-linear-gradient(top, #ffffff, #e6e6e6); background-image: -o-linear-gradient(top, #ffffff, #e6e6e6); background-image: linear-gradient(top, #ffffff, #e6e6e6); background-repeat: repeat-x; filter: progid:dximagetransform.microsoft.gradient(startColorstr=#ffffff, endColorstr=#e6e6e6, GradientType=0); border-color: #e6e6e6 #e6e6e6 #e6e6e6; border-color: rgba(0, 0, 0, 0.1) rgba(0, 0, 0, 0.1) rgba(0, 0, 0, 0.25); border: 1px solid #e6e6e6; -webkit-border-radius: 4px; -moz-border-radius: 4px; border-radius: 4px; -webkit-box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.05); -moz-box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.05); box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.05); cursor: pointer; *margin-left: .3em; }
.btn:hover, .btn:active, .btn.active, .btn.disabled, .btn[disabled] { background-color: #e6e6e6; }
.btn-large { padding: 9px 14px; font-size: 15px; line-height: normal; -webkit-border-radius: 5px; -moz-border-radius: 5px; border-radius: 5px; }
.btn:hover { color: #333333; text-decoration: none; background-color: #e6e6e6; background-position: 0 -15px; -webkit-transition: background-position 0.1s linear; -moz-transition: background-position 0.1s linear; -ms-transition: background-position 0.1s linear; -o-transition: background-position 0.1s linear; transition: background-position 0.1s linear; }
.btn-primary, .btn-primary:hover { text-shadow: 0 -1px 0 rgba(0, 0, 0, 0.25); color: #ffffff; }
.btn-primary.active { color: rgba(255, 255, 255, 0.75); }
.btn-primary { background-color: #4a77d4; background-image: -moz-linear-gradient(top, #6eb6de, #4a77d4); background-image: -ms-linear-gradient(top, #6eb6de, #4a77d4); background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#6eb6de), to(#4a77d4)); background-image: -webkit-linear-gradient(top, #6eb6de, #4a77d4); background-image: -o-linear-gradient(top, #6eb6de, #4a77d4); background-image: linear-gradient(top, #6eb6de, #4a77d4); background-repeat: repeat-x; filter: progid:dximagetransform.microsoft.gradient(startColorstr=#6eb6de, endColorstr=#4a77d4, GradientType=0); border: 1px solid #3762bc; text-shadow: 1px 1px 1px rgba(0,0,0,0.4); box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.5); }
.btn-primary:hover, .btn-primary:active, .btn-primary.active, .btn-primary.disabled, .btn-primary[disabled] { filter: none; background-color: #4a77d4; }
.btn-block { width: 100%; display: block; }

* { -webkit-box-sizing: border-box; -moz-box-sizing: border-box; -ms-box-sizing: border-box; -o-box-sizing: border-box; box-sizing: border-box; }
```

```

html { width: 100%; height:150%;}

body {
    width: 100%;
    height:100%;
    font-family: 'Open Sans', sans-serif;
    background: #b5c5d8;
    color: #fff;
    font-size: 16px;
    text-align:center-left;
    letter-spacing:1.2px;
    background: rgb(105,155,200);
background: -moz-radial-gradient(top left, ellipse cover, rgba(105,155,200,1) 0%,
rgba(181,197,216,1) 57%);
background: -webkit-gradient(radial, top left, 0px, top left, 100%, color-
stop(0%,rgba(105,155,200,1)), color-stop(57%,rgba(181,197,216,1)));
background: -webkit-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: -o-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: -ms-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: radial-gradient(ellipse at top left, rgba(105,155,200,1) 0%,rgba(181,197,216,1)
57%);
    filter: progid:DXImageTransform.Microsoft.gradient( startColorstr='#699bc8',
endColorstr='#b5c5d8',GradientType=1 );

}
.login {
    position: absolute;
    top: 40%;
    left: 50%;
    margin: -150px 0 0 -150px;
    width:400px;
    height:400px;
}

.h1 {font-size: 38px;color: #fff; text-shadow: 0 0 10px rgba(0,0,0,0.3); letter-spacing:1px; text-
align:center;margin-left: 90px; }
body .origin{padding-bottom:10px}
body .dest{padding-bottom:10px}
body .btn{padding:20px}
input {
    width: 100%;
    margin-bottom: 10px;
    background: rgba(0,0,0,0.3);
    border: none;
    outline: none;
    padding: 10px;
    font-size: 13px;
    color: #fff;

```

```

text-shadow: 1px 1px 1px rgba(0,0,0,0.3);
border: 1px solid rgba(0,0,0,0.3);
border-radius: 4px;
box-shadow: inset 0 -5px 45px rgba(100,100,100,0.2), 0 1px 1px rgba(255,255,255,0.2);
-webkit-transition: box-shadow .5s ease;
-moz-transition: box-shadow .5s ease;
-o-transition: box-shadow .5s ease;
-ms-transition: box-shadow .5s ease;
transition: box-shadow .5s ease;
}
input:focus { box-shadow: inset 0 -5px 45px rgba(100,100,100,0.4), 0 1px 1px
rgba(255,255,255,0.2); }

```

Csstyle.css

```

@import url(https://fonts.googleapis.com/css?family=Open+Sans);
.btn { display: inline-block; *display: inline; *zoom: 1; padding: 4px 10px 4px; margin-bottom:
0; font-size: 13px; line-height: 18px; color: #333333; text-align: center; text-shadow: 0 1px 1px
rgba(255, 255, 255, 0.75); vertical-align: middle; background-color: #f5f5f5; background-image:
-moz-linear-gradient(top, #ffffff, #e6e6e6); background-image: -ms-linear-gradient(top, #ffffff,
#e6e6e6); background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#ffffff), to(#e6e6e6));
background-image: -webkit-linear-gradient(top, #ffffff, #e6e6e6); background-image: -o-linear-
gradient(top, #ffffff, #e6e6e6); background-image: linear-gradient(top, #ffffff, #e6e6e6);
background-repeat: repeat-x; filter:
progid:dximagetransform.microsoft.gradient(startColorstr=#ffffff, endColorstr=#e6e6e6,
GradientType=0); border-color: #e6e6e6 #e6e6e6 #e6e6e6; border-color: rgba(0, 0, 0, 0.1)
rgba(0, 0, 0, 0.1) rgba(0, 0, 0, 0.25); border: 1px solid #e6e6e6; -webkit-border-radius: 4px; -
moz-border-radius: 4px; border-radius: 4px; -webkit-box-shadow: inset 0 1px 0 rgba(255, 255,
255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.05); -moz-box-shadow: inset 0 1px 0 rgba(255, 255, 255,
0.2), 0 1px 2px rgba(0, 0, 0, 0.05); box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px
2px rgba(0, 0, 0, 0.05); cursor: pointer; *margin-left: .3em; }
.btn:hover, .btn:active, .btn.active, .btn.disabled, .btn[disabled] { background-color: #e6e6e6; }
.btn-large { padding: 9px 14px; font-size: 15px; line-height: normal; -webkit-border-radius: 5px;
-moz-border-radius: 5px; border-radius: 5px; }
.btn:hover { color: #333333; text-decoration: none; background-color: #e6e6e6; background-
position: 0 -15px; -webkit-transition: background-position 0.1s linear; -moz-transition:
background-position 0.1s linear; -ms-transition: background-position 0.1s linear; -o-transition:
background-position 0.1s linear; transition: background-position 0.1s linear; }
.btn-primary, .btn-primary:hover { text-shadow: 0 -1px 0 rgba(0, 0, 0, 0.25); color: #ffffff; }
.btn-primary.active { color: rgba(255, 255, 255, 0.75); }
.btn-primary { background-color: #4a77d4; background-image: -moz-linear-gradient(top,
#6eb6de, #4a77d4); background-image: -ms-linear-gradient(top, #6eb6de, #4a77d4);
background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#6eb6de), to(#4a77d4));
background-image: -webkit-linear-gradient(top, #6eb6de, #4a77d4); background-image: -o-
linear-gradient(top, #6eb6de, #4a77d4); background-image: linear-gradient(top, #6eb6de,
#4a77d4); background-repeat: repeat-x; filter:
progid:dximagetransform.microsoft.gradient(startColorstr=#6eb6de, endColorstr=#4a77d4,
GradientType=0); border: 1px solid #3762bc; text-shadow: 1px 1px 1px rgba(0,0,0,0.4); box-
shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.5); }

```

```
.btn-primary:hover, .btn-primary:active, .btn-primary.active, .btn-primary.disabled, .btn-  
primary[disabled] { filter: none; background-color: #4a77d4; }  
.btn-block { width: 100%; display:block; }
```

```
* { -webkit-box-sizing:border-box; -moz-box-sizing:border-box; -ms-box-sizing:border-box; -o-  
box-sizing:border-box; box-sizing:border-box;}
```

```
html { width: 100%; height:150%;}
```

```
body {  
    width: 100%;  
    height:100%;  
    font-family: 'Open Sans', sans-serif;  
    background: #b5c5d8;  
    color: #fff;  
    font-size: 16px;  
    text-align:center-left;  
    letter-spacing:1.2px;  
    background: rgb(105,155,200);  
background: -moz-radial-gradient(top left, ellipse cover, rgba(105,155,200,1) 0%,  
rgba(181,197,216,1) 57%);  
background: -webkit-gradient(radial, top left, 0px, top left, 100%, color-  
stop(0%,rgba(105,155,200,1)), color-stop(57%,rgba(181,197,216,1)));  
background: -webkit-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)  
0%,rgba(181,197,216,1) 57%);  
background: -o-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)  
0%,rgba(181,197,216,1) 57%);  
background: -ms-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)  
0%,rgba(181,197,216,1) 57%);  
background: radial-gradient(ellipse at top left, rgba(105,155,200,1) 0%,rgba(181,197,216,1)  
57%);  
filter: progid:DXImageTransform.Microsoft.gradient( startColorstr='#699bc8',  
endColorstr='#b5c5d8',GradientType=1 );  
}  
.login {  
    position: absolute;  
    top: 40%;  
    left: 50%;  
    margin: -150px 0 0 -150px;  
    width:400px;  
    height:400px;  
}
```

```
.h1 {font-size: 38px;color: #fff; text-shadow: 0 0 10px rgba(0,0,0,0.3); letter-spacing:1px; text-  
align:center;margin-left: 90px; }  
body .origin{padding-bottom:10px}  
body .dest{padding-bottom:10px}  
body .btn{padding:20px}  
input {  
    width: 100%;  
    margin-bottom: 10px;
```

```

background: rgba(0,0,0,0.3);
border: none;
outline: none;
padding: 10px;
font-size: 13px;
color: #fff;
text-shadow: 1px 1px 1px rgba(0,0,0,0.3);
border: 1px solid rgba(0,0,0,0.3);
border-radius: 4px;
box-shadow: inset 0 -5px 45px rgba(100,100,100,0.2), 0 1px 1px rgba(255,255,255,0.2);
-webkit-transition: box-shadow .5s ease;
-moz-transition: box-shadow .5s ease;
-o-transition: box-shadow .5s ease;
-ms-transition: box-shadow .5s ease;
transition: box-shadow .5s ease;
}
input:focus { box-shadow: inset 0 -5px 45px rgba(100,100,100,0.4), 0 1px 1px
rgba(255,255,255,0.2); }

```

Lcssstyle.css

```

@import url(https://fonts.googleapis.com/css?family=Open+Sans);
.btn { display: inline-block; *display: inline; *zoom: 1; padding: 4px 10px 4px; margin-bottom:
0; font-size: 13px; line-height: 18px; color: #333333; text-align: center; text-shadow: 0 1px 1px
rgba(255, 255, 255, 0.75); vertical-align: middle; background-color: #f5f5f5; background-image:
-moz-linear-gradient(top, #ffffff, #e6e6e6); background-image: -ms-linear-gradient(top, #ffffff,
#e6e6e6); background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#ffffff), to(#e6e6e6));
background-image: -webkit-linear-gradient(top, #ffffff, #e6e6e6); background-image: -o-linear-
gradient(top, #ffffff, #e6e6e6); background-image: linear-gradient(top, #ffffff, #e6e6e6);
background-repeat: repeat-x; filter:
progid:dximagetransform.microsoft.gradient(startColorstr=#ffffff, endColorstr=#e6e6e6,
GradientType=0); border-color: #e6e6e6 #e6e6e6 #e6e6e6; border-color: rgba(0, 0, 0, 0.1)
rgba(0, 0, 0, 0.1) rgba(0, 0, 0, 0.25); border: 1px solid #e6e6e6; -webkit-border-radius: 4px; -
moz-border-radius: 4px; border-radius: 4px; -webkit-box-shadow: inset 0 1px 0 rgba(255, 255,
255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.05); -moz-box-shadow: inset 0 1px 0 rgba(255, 255, 255,
0.2), 0 1px 2px rgba(0, 0, 0, 0.05); box-shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px
2px rgba(0, 0, 0, 0.05); cursor: pointer; *margin-left: .3em; }
.btn:hover, .btn:active, .btn.active, .btn.disabled, .btn[disabled] { background-color: #e6e6e6; }
.btn-large { padding: 9px 14px; font-size: 15px; line-height: normal; -webkit-border-radius: 5px;
-moz-border-radius: 5px; border-radius: 5px; }
.btn:hover { color: #333333; text-decoration: none; background-color: #e6e6e6; background-
position: 0 -15px; -webkit-transition: background-position 0.1s linear; -moz-transition:
background-position 0.1s linear; -ms-transition: background-position 0.1s linear; -o-transition:
background-position 0.1s linear; transition: background-position 0.1s linear; }
.btn-primary, .btn-primary:hover { text-shadow: 0 -1px 0 rgba(0, 0, 0, 0.25); color: #ffffff; }
.btn-primary.active { color: rgba(255, 255, 255, 0.75); }
.btn-primary { background-color: #4a77d4; background-image: -moz-linear-gradient(top,
#6eb6de, #4a77d4); background-image: -ms-linear-gradient(top, #6eb6de, #4a77d4);
background-image: -webkit-gradient(linear, 0 0, 0 100%, from(#6eb6de), to(#4a77d4));
background-image: -webkit-linear-gradient(top, #6eb6de, #4a77d4); background-image: -o-

```



```

linear-gradient(top, #6eb6de, #4a77d4); background-image: linear-gradient(top, #6eb6de,
#4a77d4); background-repeat: repeat-x; filter:
progid:dximagetransform.microsoft.gradient(startColorstr=#6eb6de, endColorstr=#4a77d4,
GradientType=0); border: 1px solid #3762bc; text-shadow: 1px 1px 1px rgba(0,0,0,0.4); box-
shadow: inset 0 1px 0 rgba(255, 255, 255, 0.2), 0 1px 2px rgba(0, 0, 0, 0.5); }
.btn-primary:hover, .btn-primary:active, .btn-primary.active, .btn-primary.disabled, .btn-
primary[disabled] { filter: none; background-color: #4a77d4; }
.btn-block { width: 100%; display:block; }

* { -webkit-box-sizing:border-box; -moz-box-sizing:border-box; -ms-box-sizing:border-box; -o-
box-sizing:border-box; box-sizing:border-box;}

html { width: 100%; height:100%;}

body {
    width: 100%;
    height:100%;
    font-family: 'Open Sans', sans-serif;
    background: #b5c5d8;
    color: #ffffff;
    font-size: 16px;
    text-align:center-left;
    letter-spacing:1.2px;
    background: rgb(105,155,200);
background: -moz-radial-gradient(top left, ellipse cover, rgba(105,155,200,1) 0%,
rgba(181,197,216,1) 57%);
background: -webkit-gradient(radial, top left, 0px, top left, 100%, color-
stop(0%,rgba(105,155,200,1)), color-stop(57%,rgba(181,197,216,1)));
background: -webkit-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: -o-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: -ms-radial-gradient(top left, ellipse cover, rgba(105,155,200,1)
0%,rgba(181,197,216,1) 57%);
background: radial-gradient(ellipse at top left, rgba(105,155,200,1) 0%,rgba(181,197,216,1)
57%);
    filter: progid:DXImageTransform.Microsoft.gradient( startColorstr='#699bc8',
endColorstr='#b5c5d8',GradientType=1 );

}
.register {
    position: absolute;
    top: 40%;
    left: 50%;
    margin: -150px 0 0 -150px;
    width:400px;
    height:400px;
}
.login {
    position: absolute;
    top: 40%;

```

```

    left: 50%;
    margin: -150px 0 0 -150px;
    width: 400px;
    height: 400px;
}
.h1 { font-size: 38px; color: #fff; text-shadow: 0 0 10px rgba(0,0,0,0.3); letter-spacing: 1px; text-align: center; margin-left: 90px; }
body .origin { padding-bottom: 10px; }
body .dest { padding-bottom: 10px; }
body .btn { padding: 20px; }
input {
    width: 100%;
    margin-bottom: 10px;
    background: #ffff;
    border: none;
    outline: none;
    padding: 10px;
    font-size: 13px;
    color: #ffffff;
    text-shadow: 1px 1px 1px rgba(0,0,0,0.3);
    border: 1px solid rgba(0,0,0,0.3);
    border-radius: 4px;
    box-shadow: inset 0 -5px 45px rgba(100,100,100,0.2), 0 1px 1px rgba(255,255,255,0.2);
    -webkit-transition: box-shadow .5s ease;
    -moz-transition: box-shadow .5s ease;
    -o-transition: box-shadow .5s ease;
    -ms-transition: box-shadow .5s ease;
    transition: box-shadow .5s ease;
}
input:focus { box-shadow: inset 0 -5px 45px rgba(100,100,100,0.4), 0 1px 1px rgba(255,255,255,0.2); }

```

App IBM.py

```

import numpy as np
import os
from flask import Flask, request, jsonify, render_template, json, redirect, url_for, flash
import pickle
import requests
import sqlite3

# NOTE: you must manually set API_KEY below using information retrieved from your IBM
Cloud account.
API_KEY = "okbr7ARnOQjyplTOyvNFC2QVkJCF6q7afpci065Hucby8"
token_response = requests.post('https://iam.cloud.ibm.com/identity/token', data={"apikey":
    API_KEY, "grant_type": 'urn:ibm:params:oauth:grant-type:apikey'})
mltoken = token_response.json()["access_token"]

header = {'Content-Type': 'application/json', 'Authorization': 'Bearer ' + mltoken}

```

```

app = Flask(__name__)
app.secret_key="21433253"
model = pickle.load(open('rfmodel.pkl', 'rb'))
conn=sqlite3.connect("database1.db")
conn.execute("CREATE TABLE IF NOT EXISTS login(email TEXT PRIMARY
KEY,password TEXT)")
conn.close()

@app.route('/')
def main():
    return render_template('login.html')

@app.route('/login',methods=['POST','GET'])
def login():
    if request.method=='POST':
        try:
            fv=[x for x in request.form.values()]
            email=request.form["email"]
            pswd=request.form["pswd"]
            conn=sqlite3.connect("database1.db")
            cur=conn.cursor()
            cur.execute("SELECT password FROM login WHERE email=?;",(str(email),))
            result=cur.fetchone()
            cur.execute("SELECT * FROM login")
            if result:
                if result[0]==pswd:
                    flash("login successfully",'success')
                    return redirect('/home')
                else:
                    return render_template("login.html", error="please enter correct password")

            else:
                print("register")
                flash("please Register",'danger')

                return render_template('register.html',alert="user not found,please register")

        except Exception as e:
            return "hello error"

@app.route('/reg')
def reg():
    return render_template("register.html")

@app.route('/register',methods=['POST','GET'])
def register():
    if request.method=='POST':
        try:
            fv=[x for x in request.form.values()]
            email=request.form["email"]
            pswd=request.form["pswd"]

```

```

conn=sqlite3.connect("database1.db")
cur=conn.cursor()
cur.execute("SELECT * FROM login WHERE email=?;",(str(email),))
result=cur.fetchone()
if result:
    flash("user already exist,please login",'danger')
    return render_template('login.html',alert="user already exist,please login")
else:
    cur.execute("INSERT INTO login(email,password)values(?,?)",(str(email),str(pswd)))
    conn.commit()
    cur.execute("SELECT * FROM login")
    flash("Registered successfully",'success')
    return render_template('login.html',message="Registered successfully,please login")

except Exception as e:
    print(e)
    #flash(e,'danger')
    return "hello error1"

#return redirect('/')
# return render_template('login.html')
@app.route('/home')
def home():
    return render_template('mainpage.html')

@app.route('/predict',methods=['POST'])
def predict():
    """
    For rendering results on HTML GUI
    """
    sm=[6,7,8]
    wt=[9,10,11]
    sp=[12,1,2,3]
    fl=[4,5]
    farr= [int(x) for x in request.form.values()]
    if farr[1] in sm:
        farr.append(0)
    elif farr[1] in wt:
        farr.append(1)
    elif farr[1] in sp:
        farr.append(2)
    else:
        farr.append(3)
    final_features=[int(x) for x in farr]
    print(final_features)
    payload_scoring = {"input_data": [{"fields":
[[ 'QUARTER','MONTH','DAY_OF_MONTH','DAY_OF_WEEK','FL_NUM','ORIGIN','DEST','
CRS_DEP_TIME.1','CRS_ARR_TIME.1','CRS_ELAPSED_TIME','DISTANCE','SEASON']],
"values": [final_features]}]}

```

```

response_scoring = requests.post('https://us-
south.ml.cloud.ibm.com/ml/v4/deployments/b54f9857-1352-432a-8ab1-
144ebda20501/predictions?version=2022-11-08',
json=payload_scoring,headers={'Authorization': 'Bearer ' + mltoken})
print("Scoring response")
pred=response_scoring.json()
print(pred)
prediction=pred['predictions'][0]['values'][0][0]
#prediction = model.predict([final_features])
print(prediction)

output =prediction

if output==0:
    return render_template('result.html', prediction_text='No delay will happen
{}'.format(output))
elif output==1:
    return render_template('result.html', prediction_text='There is a chance to departure delay
will happen {}'.format(output))
elif output==2:
    return render_template('result.html', prediction_text='here is a chance to both departure and
arrival delay will happen {}'.format(output))
elif output==3:
    return render_template('result.html', prediction_text='here is a chance to flight will diverted
{}'.format(output))
elif output==4:
    return render_template('result.html', prediction_text='here is a chance to cancel the flight
{}'.format(output))
else:
    return render_template('result.html', prediction_text='output {}'.format(output))
"@app.route('/predict_api',methods=['POST'])
def predict_api():

```

For direct API calls trough request

```

data = request.get_json(force=True)
prediction = model.predict([np.array(list(data.values()))])
output = prediction[0]
return jsonify(output)

if __name__ == "__main__":
    os.environ.setdefault('FLASK_ENV', 'development')
    app.run(debug=False)

```

App.py

```

import numpy as np
import os
from flask import Flask, request, jsonify, render_template
import pickle

```

```

app = Flask(__name__)
model = pickle.load(open('rfmodel.pkl', 'rb'))

@app.route('/')
def home():
    return render_template('mainpage.html')

@app.route('/predict',methods=['POST'])
def predict():
    """
    For rendering results on HTML GUI
    """
    sm=[6,7,8]
    wt=[9,10,11]
    sp=[12,1,2,3]
    fl=[4,5]
    farr= [int(x) for x in request.form.values()]
    if farr[1] in sm:
        farr.append(0)
    elif farr[1] in wt:
        farr.append(1)
    elif farr[1] in sp:
        farr.append(2)
    else:
        farr.append(3)
    final_features=np.array(farr,dtype='int64')
    print(final_features)
    prediction = model.predict([final_features])

    output = round(prediction[0])

    if output==0:
        return render_template('mainpage.html', prediction_text='No delay will happen
{}'.format(output))
    elif output==1:
        return render_template('mainpage.html', prediction_text='There is a chance to departure
delay will happen {}'.format(output))
    elif output==2:
        return render_template('mainpage.html', prediction_text='here is a chance to both departure
and arrival delay will happen {}'.format(output))
    elif output==3:
        return render_template('mainpage.html', prediction_text='here is a chance to flight will
diverted {}'.format(output))
    elif output==4:
        return render_template('mainpage.html', prediction_text='here is a chance to cancel the
flight {}'.format(output))
    else:
        return render_template('mainpage.html', prediction_text='output {}'.format(output))
    """@app.route('/predict_api',methods=['POST'])

```

```
def predict_api():
```

For direct API calls through request

```
data = request.get_json(force=True)
prediction = model.predict([np.array(list(data.values()))])
output = prediction[0]
return jsonify(output)"""
```

```
if __name__ == "__main__":
```

```
os.environ.setdefault('FLASK_ENV', 'development')
app.run(debug=False)
```

GITHUB ID:

<https://github.com/IBM-EPBL/IBM-Project-16140-1659608167Arsha.docx>

DEMO VIDEO LINK:

<https://clipchamp.com/watch/hdILitv4n4S>