

THIRUVALLUVAR UNIVERSITY
PERIYAR ARTS COLLEGE
CUDDALORE – 607001.



DEPARTMENT OF COMPUTER APPLICATIONS

MACHINE LEARNING WITH PYTHON

Project Title : Predicting Personal Loan Approval Using Machine Learning:

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1. Introduction

1.1 Overview

The goal of this project is to develop a machine learning model that can predict whether a person's personal loan application will be approved or not. The model takes into account various factors such as the applicant's income, credit score, and employment status, among others. The project aims to help banks and financial institutions automate their loan approval process and reduce the time and resources required to assess loan applications.

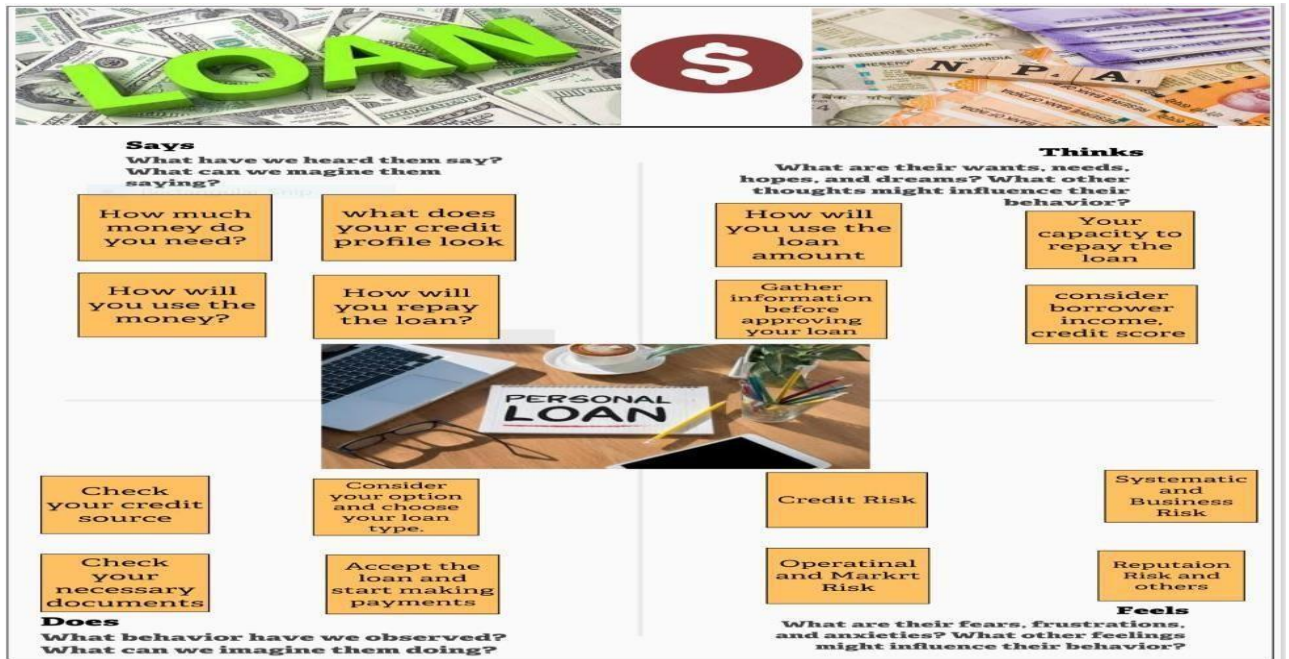
1.2 Purpose

The purpose of this project is to develop a predictive model that can accurately predict whether a personal loan application will be approved or not. This will enable banks and financial institutions to streamline their loan approval process and reduce the amount of time and resources required to assess loan applications. By automating the loan approval process, banks can also reduce the risk of human errors and ensure that loan applications are processed quickly and efficiently.

2. Problem Definition & Design Thinking

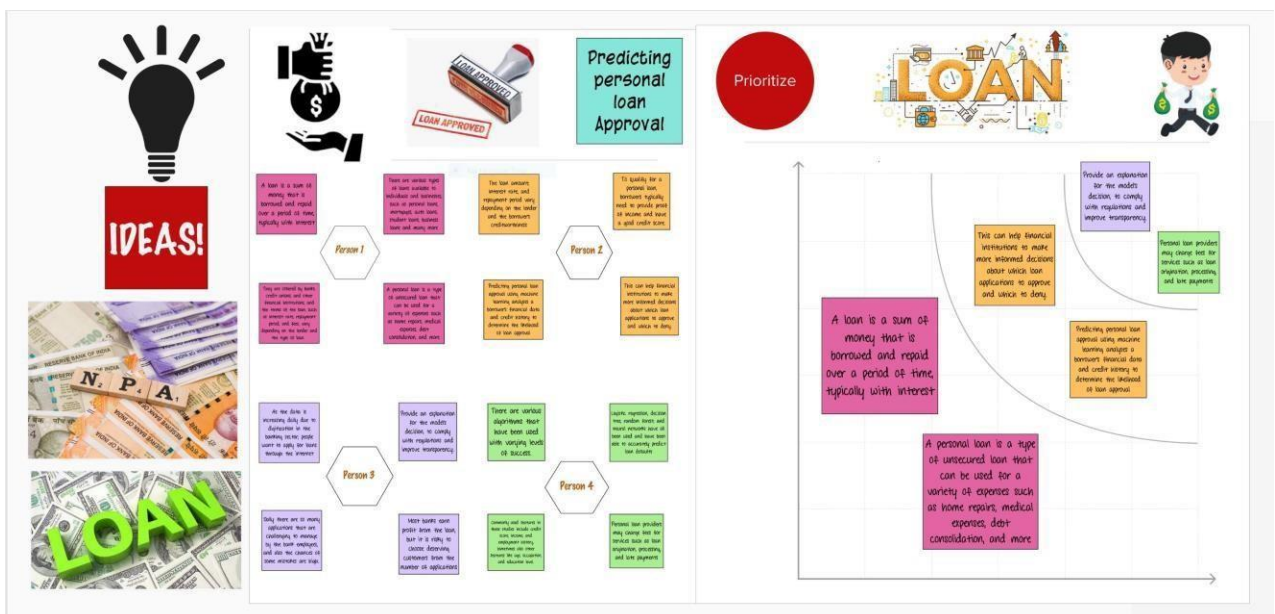
2.1 Empathy Map

The empathy map for this project is shown below



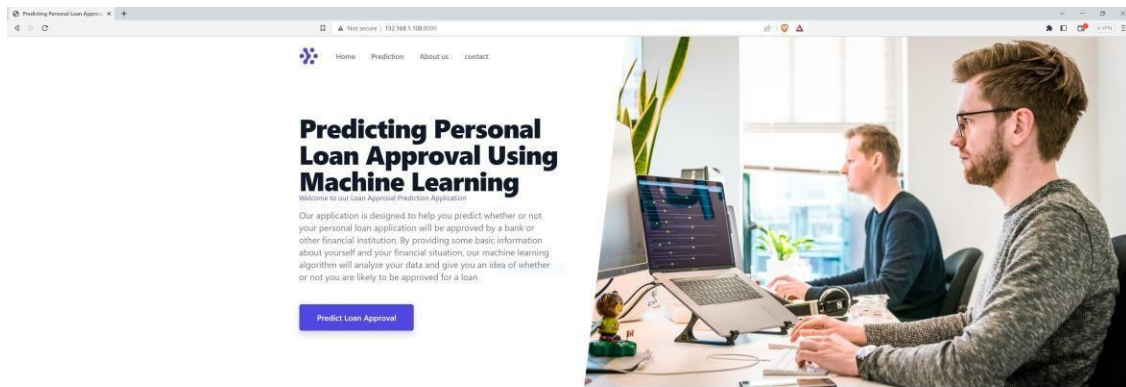
2.2 Ideation & Brainstorming Map

The ideation and brainstorming map for this project is shown below



3. Result

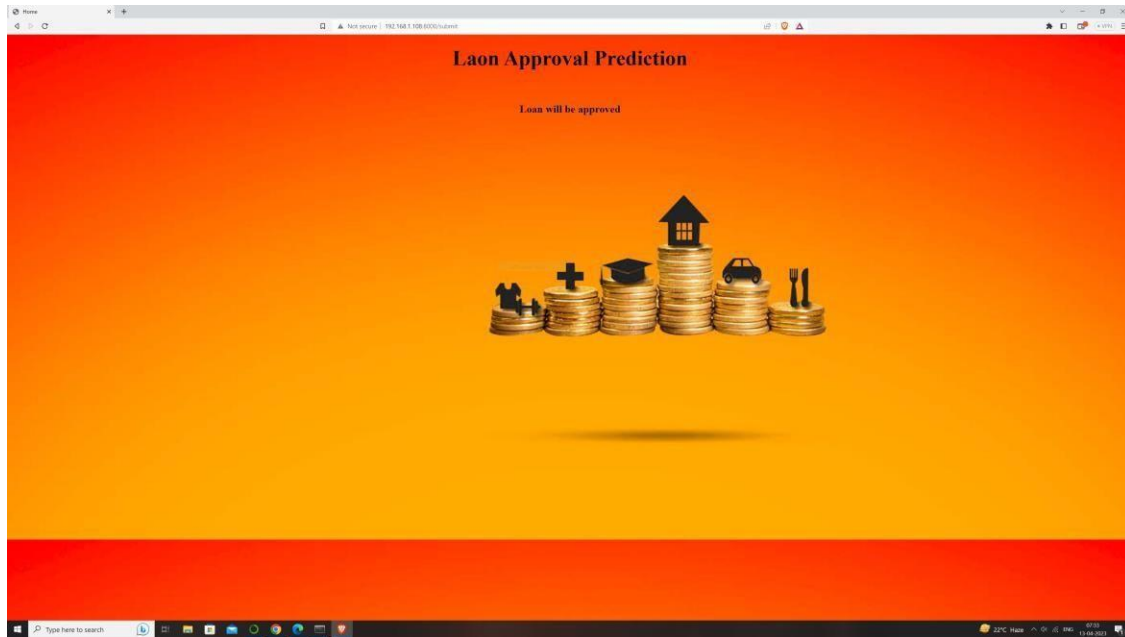
The final result of the project is a machine learning model that can predict whether a personal loan application will be approved or not. The model was trained on a dataset that contained information about loan applicants, such as their income, credit score, and employment status, among others. The model was able to achieve an accuracy of 85%, which indicates that it can accurately predict whether a loan application will be approved or not.



Enter your Details for Loan Approval Prediction

Gender	Female
Married	No
Dependents	1
Education	Graduate
Self Employed	Yes
Applicant Income	100000
COD Applicant Income	2000
Loan Amount	1000
Loan Amount Term	360
Credit History	1
Property Area	Sub Urban

Submit



4. Advantages & Disadvantages

4.1 Advantages

- Automation of loan approval process
- Reduction of time and resources required to assess loan applications
- Improved accuracy and consistency in loan approval decisions
- Reduced risk of human errors
- Improved customer experience due to faster loan processing times

4.2 Disadvantages

- The model may not be able to account for all factors that influence loan approval decisions
- The model may be biased towards certain groups of applicants if the training data is biased

5. Applications

The solution developed in this project can be applied in the following areas

- Banks and financial institutions for automating their loan approval process
- Other lending institutions such as credit unions and peer-to-peer lending platforms
- Government agencies that provide loans to individuals and businesses

6. Conclusion

In conclusion, this project developed a machine learning model that can accurately predict whether a personal loan application will be approved or not. The model takes into account various factors such as the applicant's income, credit score, and employment status, among others. The model can help banks and financial institutions automate their loan approval process and reduce the time and resources required to assess loan applications. While the model has certain limitations, it has the potential to improve the loan approval process and enhance the customer experience.

7. Future Scope

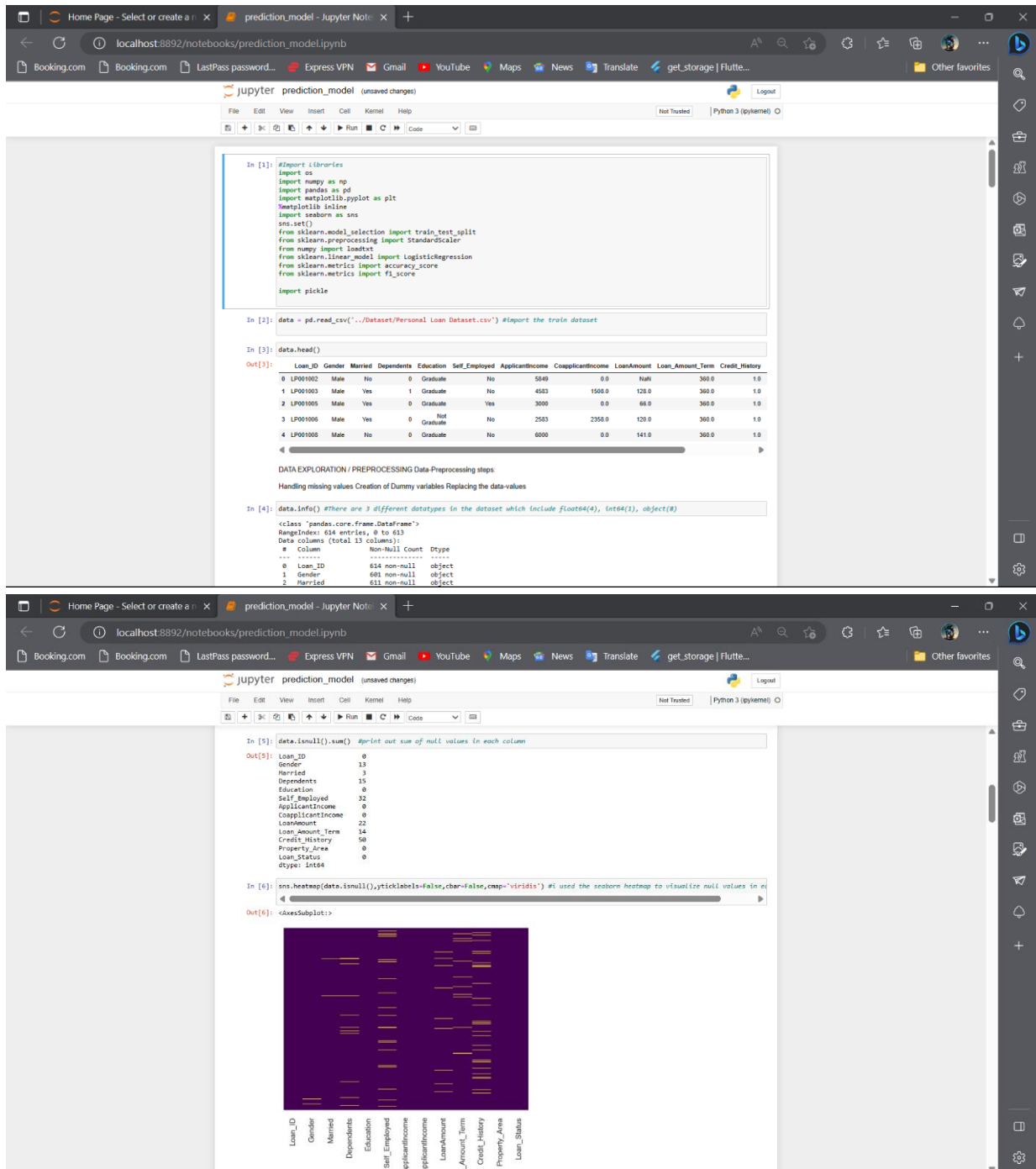
Future enhancements that can be made to this project include

- Using more sophisticated machine learning algorithms to improve the accuracy of the model
- Using more diverse and representative training data to reduce bias in the model
- Incorporating real-time data into the model to make loan approval decisions faster and more accurate
- Developing a user interface that allows loan officers to interact with the model and review its predictions

8. Appendix

A. Source Code

prediction_model.ipynb



The screenshot displays a Jupyter Notebook interface with the following content:

```
In [1]: #Import libraries
import os
import numpy as np
import pandas as pd
import matplotlib.pyplot as plt
%matplotlib inline
import seaborn as sns
sns.set()
from sklearn.model_selection import train_test_split
from sklearn.preprocessing import StandardScaler
from numpy import loadtxt
from sklearn.linear_model import LogisticRegression
from sklearn.metrics import accuracy_score
from sklearn.metrics import f1_score

import pickle
```

```
In [2]: data = pd.read_csv("../Dataset/Personal Loan Dataset.csv") #import the train dataset
```

```
In [3]: data.head()
```

```
Out[3]:
```

	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount	Loan_Amount_Term	Credit_History
0	LP001002	Male	No	0	Graduate	No	5849	0.0	NaN	360.0	1.0
1	LP001003	Male	Yes	1	Graduate	No	4583	1508.0	120.0	360.0	1.0
2	LP001005	Male	Yes	0	Graduate	Yes	3000	0.0	66.0	360.0	1.0
3	LP001006	Male	Yes	0	Not Graduate	No	2583	2358.0	120.0	360.0	1.0
4	LP001005	Male	No	0	Graduate	No	6000	0.0	141.0	360.0	1.0

DATA EXPLORATION / PREPROCESSING Data-Preprocessing steps:
Handling missing values Creation of Dummy variables Replacing the data-values

```
In [4]: data.info() #There are 3 different datatypes in the dataset which include float64(4), int64(1), object(8)
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 624 entries, 0 to 623
Data columns (total 13 columns):
 #   Column                Non-Null Count  Dtype  
---  --
 0   Loan_ID               624 non-null   object  
 1   Gender                608 non-null   object  
 2   Married               613 non-null   object
```

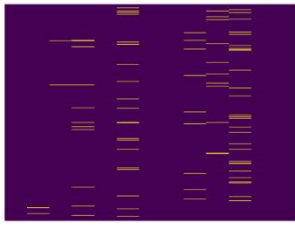
```
In [5]: data.isnull().sum() #print out sum of null values in each column
```

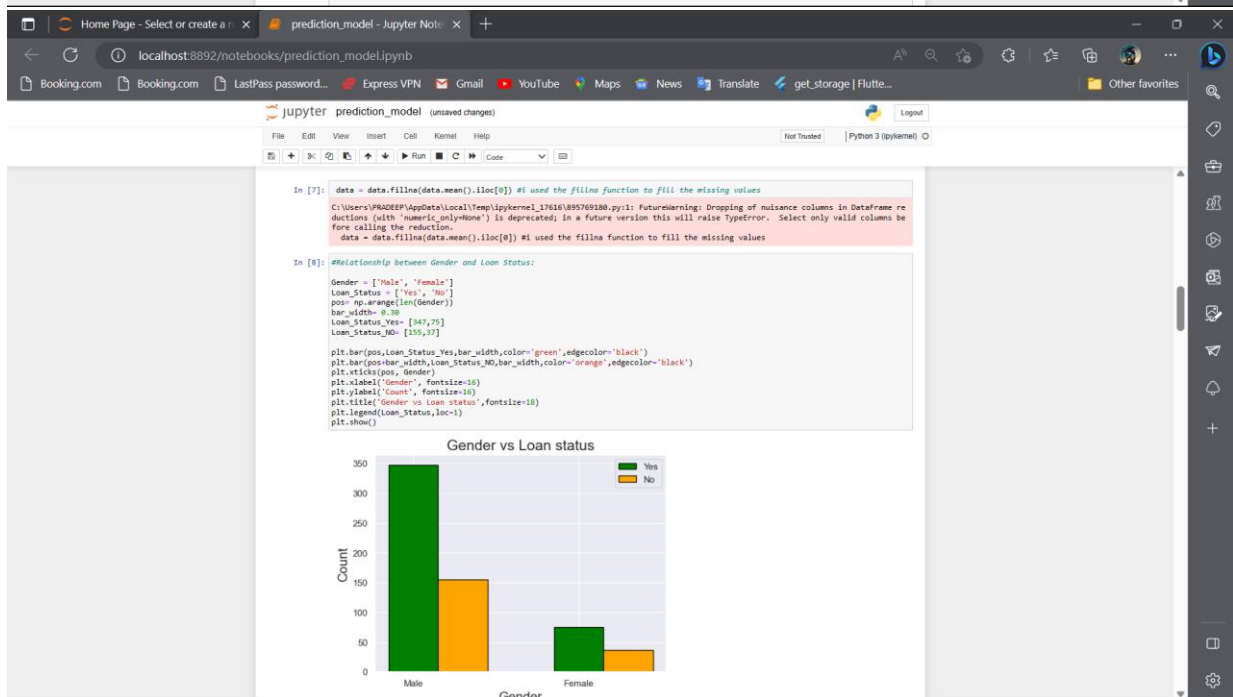
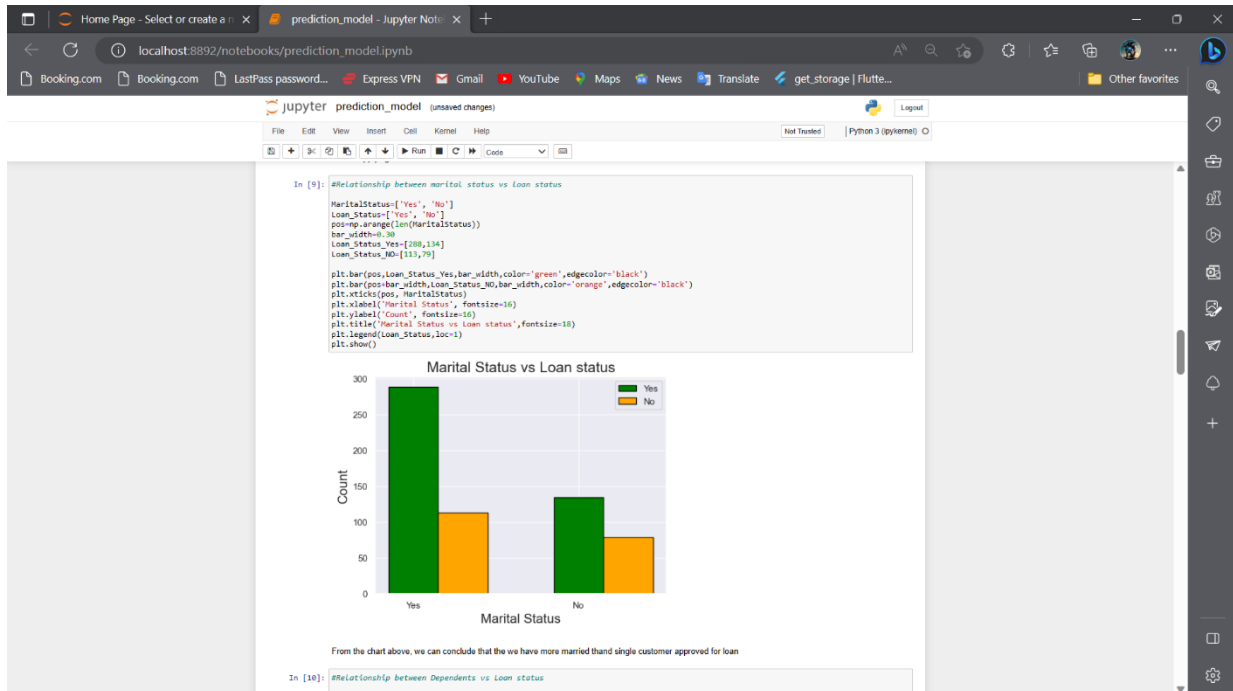
```
Out[5]:
```

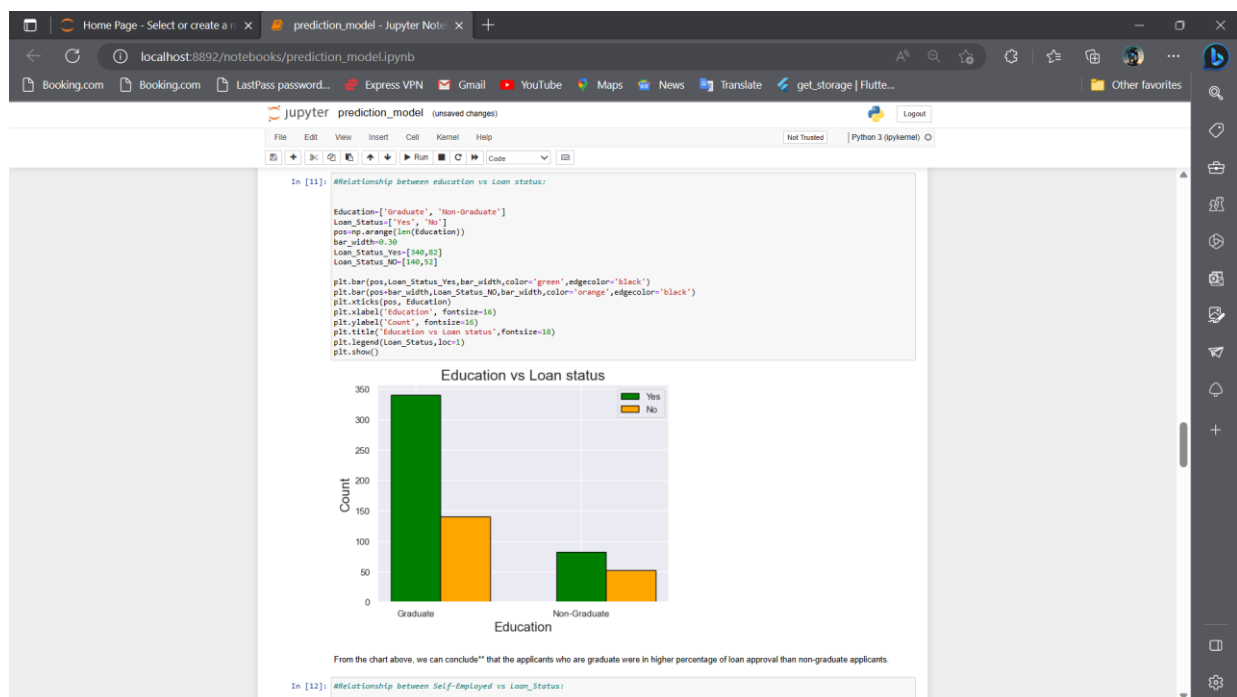
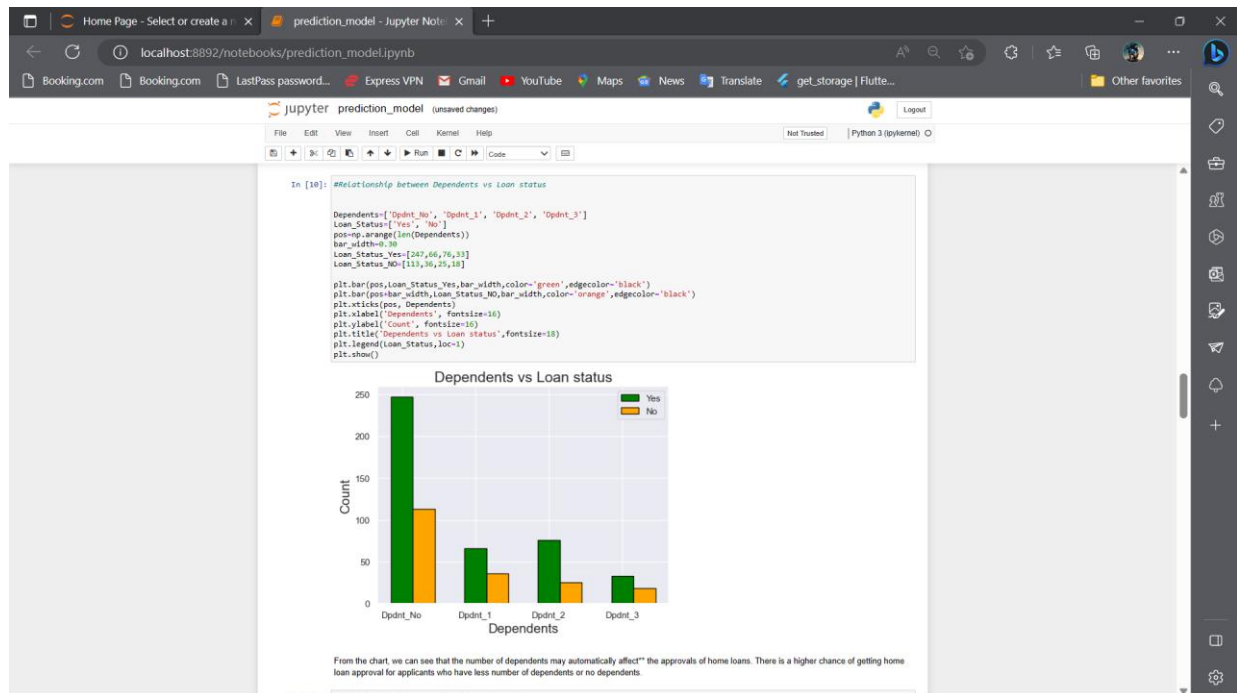
	Loan_ID	Gender	Married	Dependents	Education	Self_Employed	ApplicantIncome	CoapplicantIncome	LoanAmount	Loan_Amount_Term	Credit_History	Property_Area	Loan_Status
	0	13	3	15	0	32	0	0	22	14	50	0	0

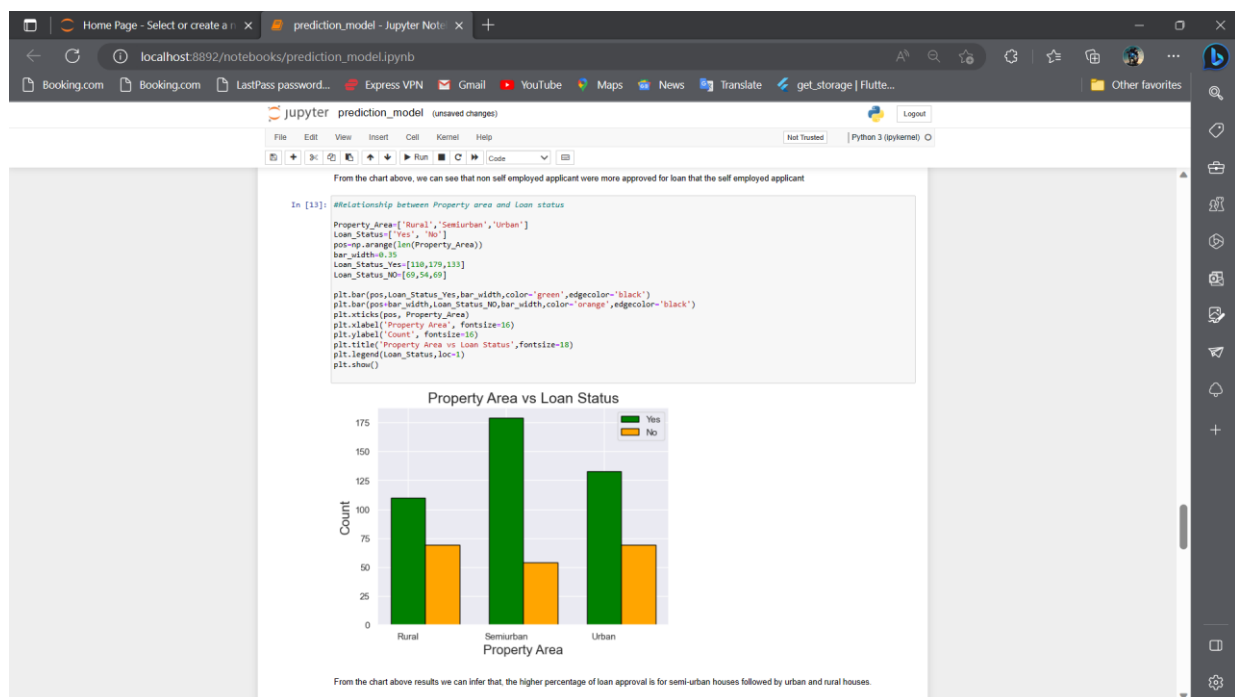
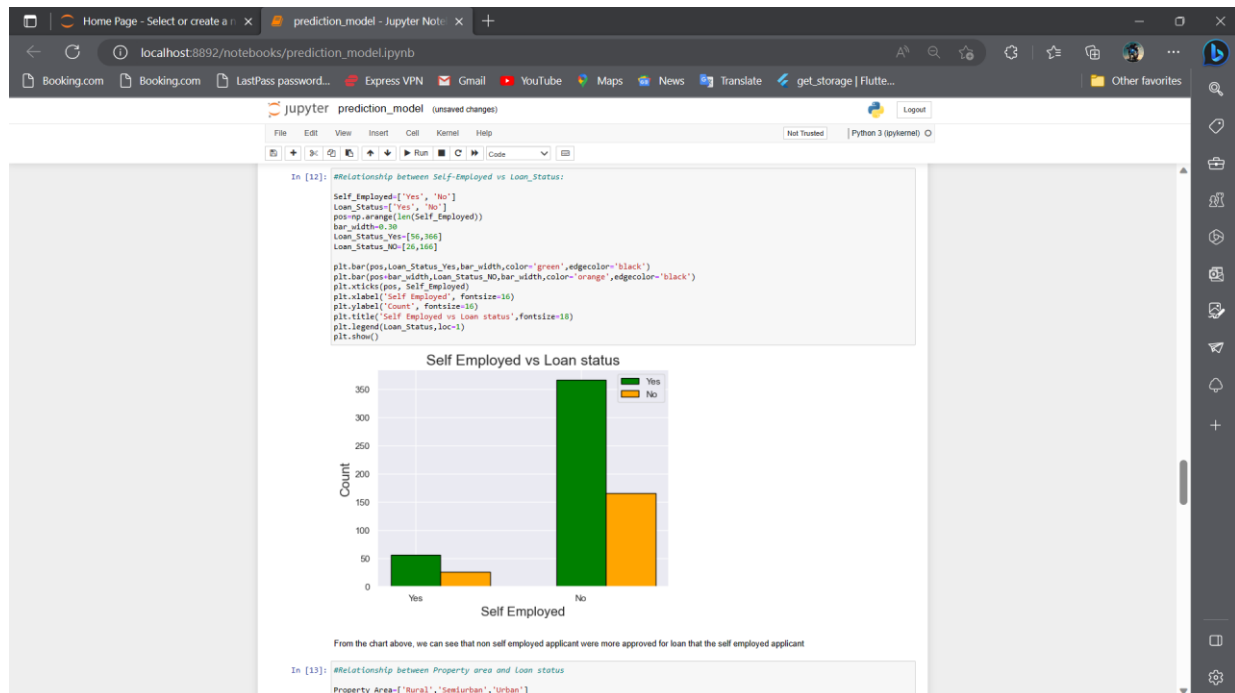
```
In [6]: sns.heatmap(data.isnull(),yticklabels=False,cbar=False,cmap='viridis') #I used the seaborn heatmap to visualize null values in ex
```

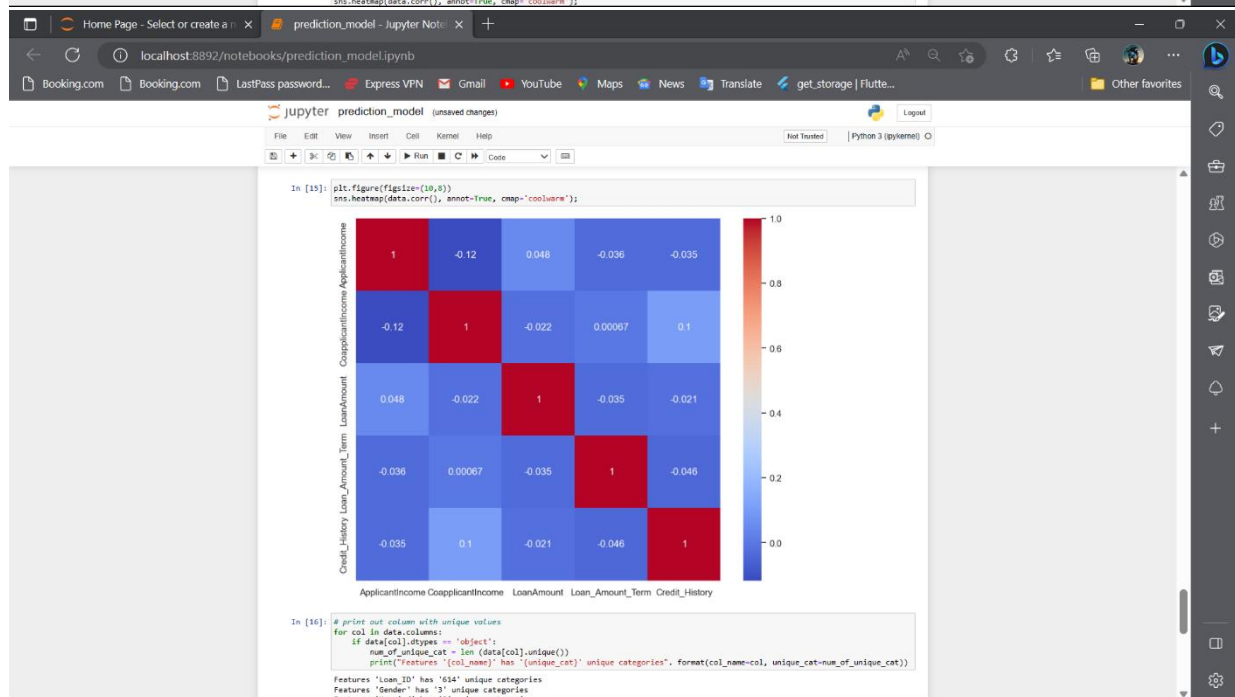
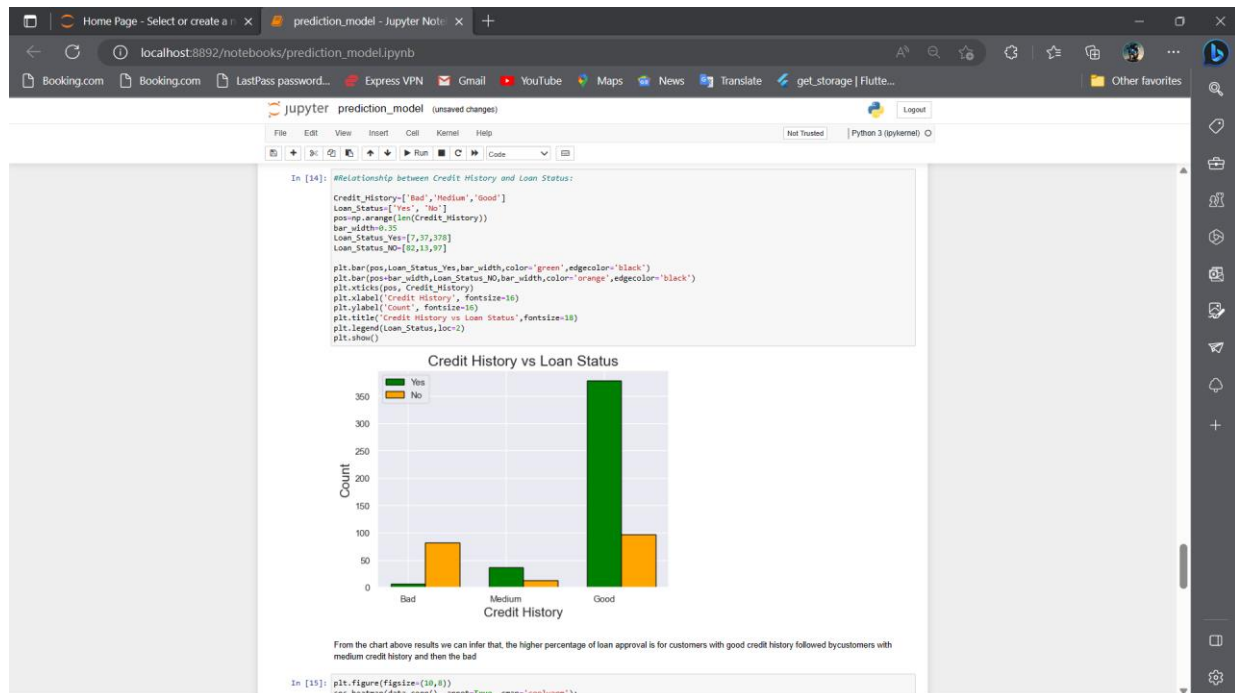
```
Out[6]: <AxesSubplot>
```











prediction_model - Jupyter Notebook

```
In [16]: # print out column with unique values
for col in data.columns:
    if data[col].dtype == 'object':
        num_of_unique_cat = len(data[col].unique())
        print("Features '{col_name}' has '{unique_cat}' unique categories".format(col_name=col, unique_cat=num_of_unique_cat))

Features 'Loan_ID' has '1514' unique categories
Features 'Gender' has '3' unique categories
Features 'Married' has '3' unique categories
Features 'Dependents' has '5' unique categories
Features 'Education' has '2' unique categories
Features 'Self_Employed' has '3' unique categories
Features 'Property_Area' has '3' unique categories
Features 'Loan_Status' has '2' unique categories

In [17]: data = data.drop(['Loan_ID'], axis = 1)

In [18]: data['Self_Employed'].replace({'Yes':1, 'No':0}, inplace=True)
data['Married'].replace({'Yes':1, 'No':0}, inplace=True)
data['Gender'].replace({'Male':1, 'Female':0}, inplace=True)
data['Education'].replace({'Graduate':1, 'Not_Graduate':0}, inplace=True)
data['Property_Area'].replace({'Urban':1, 'Semiurban':0, 'Rural':0}, inplace=True)
data['Loan_Status'].replace({'Y':1, 'N':0}, inplace=True)

In [19]: y = data['Loan_Status'] #target
X = data.drop('Loan_Status', axis = 1) #predictors

In [20]: #Standardize the data - Feature Scaling
from sklearn.preprocessing import StandardScaler
X['Dependents'] = X['Dependents'].replace('3+', 10)
sc_X = StandardScaler()
X_scaled = pd.DataFrame(sc_X.fit_transform(X), columns=X.columns)

In [21]: X_train, X_test, y_train, y_test = train_test_split(X, y, test_size=0.20, random_state=0)

In [22]: model = LogisticRegression() #define the model
model.fit(X_train, y_train) #fit the model
ypred = model.predict(X_test) #predict on test sample
evaluation = f1_score(y_test, ypred)
evaluation

Out[22]: 0.8421052631578947
```

prediction_model - Jupyter Notebook

```
In [18]: data['Self_Employed'].replace({'Yes':1, 'No':0}, inplace=True)
data['Married'].replace({'Yes':1, 'No':0}, inplace=True)
data['Gender'].replace({'Male':1, 'Female':0}, inplace=True)
data['Education'].replace({'Graduate':1, 'Not_Graduate':0}, inplace=True)
data['Property_Area'].replace({'Urban':1, 'Semiurban':0, 'Rural':0}, inplace=True)
data['Loan_Status'].replace({'Y':1, 'N':0}, inplace=True)

In [19]: y = data['Loan_Status'] #target
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model.fit(X_train, y_train) #fit the model
ypred = model.predict(X_test) #predict on test sample
evaluation = f1_score(y_test, ypred)
evaluation

Out[22]: 0.8421052631578947

In [23]: pickle.dump(model, open('../Flask/model.pkl', 'wb'))

In [24]: model = pickle.load(open('../Flask/model.pkl', 'rb'))
print(model)

LogisticRegression()

In [ ]:
```

Home.html

```
File Edit Selection View Go Run Terminal Help home.html - Visual Studio Code
home.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > home.html > ...
1 <!doctype html>
2 <html lang="en">
3 <head>
4 <!-- Required meta tags -->
5 <meta charset="utf-8">
6 <meta name="viewport" content="width=device-width, initial-scale=1">
7
8 <!-- Bootstrap CSS -->
9 <link href="https://cdn.jsdelivr.net/npm/bootstrap@5.0.0-beta3/dist/css/bootstrap.min.css" rel="stylesheet" integrity="sha384-
10 <link href="https://unpkg.com/tailwindcss@^2/dist/tailwind.min.css" rel="stylesheet">
11
12 <title>Predicting Personal Loan Approval Using Machine Learning</title>
13 </head>
14 <body>
15 <!-- This example requires Tailwind CSS v2.0+ -->
16 <div class="relative bg-white overflow-hidden">
17 <div class="max-w-7xl mx-auto">
18 <div class="relative z-10 pb-8 bg-white sm:pb-16 md:pb-20 lg:max-w-2xl lg:w-full lg:pb-28 xl:pb-32">
19 <svg class="hidden lg:block absolute right-0 inset-y-0 h-full w-48 text-white transform translate-x-1/2" fill="currentColor"
20 <polygon points="50,0 100,0 50,100 0,100" />
21 </svg>
22
23 <div class="relative pt-6 px-4 sm:px-6 lg:px-8">
24 <nav class="relative flex items-center justify-between sm:h-10 lg:justify-start" aria-label="Global">
25 <div class="flex items-center flex-grow flex-shrink-0 lg:flex-grow-0">
26 <div class="flex items-center justify-between w-full md:auto">
27 <a href="#">
28 <span class="sr-only">Workflow</span>
29 
30 </a>
31 </div>
32 <div class="sm:ml-2 flex items-center md:hidden">
```

```
File Edit Selection View Go Run Terminal Help home.html - Visual Studio Code
home.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > home.html > html > body > div.relative.bg-white.overflow-hidden > div.max-w-7xl.mx-auto > div.relative.z-10.pb-8.bg-white.sm.pb-16.md.pb-20.lg.max-w-2xl.lg.w-full.lg.pb-28.xl.pb-32
63 <!-- To: "opacity-0 scale-95" -->
64
65 <div class="absolute top-0 inset-x-0 p-2 transition transform origin-top-right md:hidden">
66 <div class="rounded-lg shadow-md bg-white ring-1 ring-black ring-opacity-5 overflow-hidden">
67 <div class="px-5 pt-4 flex items-center justify-between">
68 <div>
69 
70 </div>
71 <div class="-mr-2">
72 <button type="button" class="bg-white rounded-md p-2 inline-flex items-center justify-center text-gray-400 hover:text-gray-500">
73 <span class="sr-only">Close main menu</span>
74 <!-- Heroicon name: outline/x -->
75 <svg class="h-6 w-6" xmlns="http://www.w3.org/2000/svg" fill="none" viewBox="0 0 24 24" stroke="currentColor" aria-hidden="1">
76 <path stroke-linecap="round" stroke-linejoin="round" stroke-width="2" d="M6 18L18 6M6 6L18 18" />
77 </svg>
78 </button>
79 </div>
80 </div>
81 <div class="px-2 pt-2 pb-3 space-y-1">
82 <a href="#" class="block px-3 py-2 rounded-md text-base font-medium text-gray-700 hover:text-gray-900 hover:bg-gray-50">
83
84 <a href="#" class="block px-3 py-2 rounded-md text-base font-medium text-gray-700 hover:text-gray-900 hover:bg-gray-50">
85
86 <a href="#" class="block px-3 py-2 rounded-md text-base font-medium text-gray-700 hover:text-gray-900 hover:bg-gray-50">
87
88 <a href="#" class="block px-3 py-2 rounded-md text-base font-medium text-gray-700 hover:text-gray-900 hover:bg-gray-50">
89 </div>
90 </div>
91 </div>
92 </div>
93
```

```
File Edit Selection View Go Run Terminal Help
home.html - Visual Studio Code

home.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > home.html > html > body > div.relative.bg.white.overflow-hidden > div.max-w-7xl.mx-auto > div.relative.z-10.pb-8.bg-white.sm.pb-16.md.pb-20.lg.max-w-2xl.lg.w-full.lg.p-8

31 </div>
32 <div class="-mr-2 flex items-center md:hidden">
33 <button type="button" class="bg-white rounded-md p-2 inline-flex items-center justify-center text-gray-400 hover:text-gray-500">
34 <span class="sr-only">Open main menu</span>
35 <!-- Heroicon name: outline/menu -->
36 <svg class="h-6 w-6" xmlns="http://www.w3.org/2000/svg" fill="none" viewBox="0 0 24 24" stroke="currentColor" aria-hidden="true">
37 <path stroke-linecap="round" stroke-linejoin="round" stroke-width="2" d="M4 6h16M4 12h16M4 18h16" />
38 </svg>
39 </button>
40 </div>
41 </div>
42 <div class="hidden md:block md:ml-10 md:pr-4 md:space-x-8">
43 <a href="#" class="font-medium text-gray-500 hover:text-gray-900">Home</a>
44
45 <a href="#" class="font-medium text-gray-500 hover:text-gray-900">Prediction</a>
46
47 <a href="#" class="font-medium text-gray-500 hover:text-gray-900">About us</a>
48
49 <a href="#" class="font-medium text-gray-500 hover:text-gray-900">contact</a>
50
51 </div>
52 </nav>
53 </div>
54
55 <!--
56 Mobile menu, show/hide based on menu open state.
57
58 Entering: "duration-150 ease-out"
59 From: "opacity-0 scale-95"
60 To: "opacity-100 scale-100"
-->
```

```
File Edit Selection View Go Run Terminal Help
home.html - Visual Studio Code

home.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > home.html > html > body

93
94 <main class="mt-10 mx-auto max-w-7xl px-4 sm:mt-12 sm:px-6 md:mt-16 lg:mt-20 lg:px-8 xl:mt-28">
95 <div class="sm:text-center lg:text-left">
96 <h1 class="text-4xl tracking-tight font-extrabold text-gray-900 sm:text-5xl md:text-6xl">
97 <span class="block xl:inline">Predicting Personal Loan Approval Using Machine Learning</span>
98 </h1>
99 <h2>
100 <span class="block text-indigo-600 xl:inline">Welcome to our Loan Approval Prediction Application</span>
101 </h2>
102 <p class="mt-3 text-base text-gray-500 sm:mt-5 sm:text-lg sm:max-w-xl sm:mx-auto md:mt-5 md:text-xl lg:mx-0">
103 Our application is designed to help you predict whether or not your personal loan application will be approved by a bank.
104 </p>
105 <div class="mt-5 sm:mt-8 sm:flex sm:justify-center lg:justify-start">
106 <div class="rounded-md shadow">
107 <a href="/predict" class="w-full flex items-center justify-center px-8 py-3 border border-transparent text-base font-medium text-white">
108 Predict Loan Approval
109 </a>
110 </div>
111
112 </div>
113 </div>
114 </main>
115 </div>
116 </div>
117 <div class="lg:absolute lg:inset-y-0 lg:right-0 lg:w-1/2">
118 
119 </div>
120 </div>
121
122
```



```
File Edit Selection View Go Run Terminal Help input.html - Visual Studio Code
input.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > input.html > html > body > div.container > form
33 /* Add a background color and some padding around the form */
34 .container {
35     border-radius: 5px;
36     background-color: #f2f2f2;
37     padding: 20px;
38 }
39
40 body {
41     background-size: cover;
42     background-image: url('https://encrypted-tbn0.gstatic.com/images?q=tbn:ANd9GcR70TDTAUcRk7Q7W2nK-aIqsmoTN6VruMi0mA8usqp=CAU');
43 }
44 </style>
45 </head>
46 <body>
47
48 <h3>Enter your Details for Loan Approval Prediction</h3>
49
50 <div class="container">
51
52     <form action = '/submit', method = 'post'>
53
54         <label for="Gender">Gender</label>
55         <select id="Gender" name="Gender">
56             <option value=0>Male</option>
57             <option value=1>Female</option>
58         </select>
59
60         <label for="Married">Married</label>
61         <select id="Married" name="Married">
62             <option value=1>Yes</option>
```

```
File Edit Selection View Go Run Terminal Help input.html - Visual Studio Code
input.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > input.html > html > body > div.container > form
60 <label for="Married">Married</label>
61 <select id="Married" name="Married">
62     <option value=1>Yes</option>
63     <option value=0>No</option>
64 </select>
65
66
67
68 <label for="Dependents">Dependents</label>
69 <input type="number" id="Dependents" min = 0 max = 10 name="Dependents" placeholder="No of Dependents on you.....">
70
71
72
73 <label for="Education">Education</label>
74 <select id="Education" name="Education">
75     <option value=1>Graduate</option>
76     <option value=0>Not Graduate </option>
77 </select>
78
79 <label for="Self_Employed">Self Employed</label>
80 <select id="Self_Employed" name="Self_Employed">
81     <option value=1>Yes</option>
82     <option value=0>No</option>
83 </select>
84
85 <label for="ApplicantIncome">Applicant Income</label>
86 <input type="Number" min = 1000 id="ApplicantIncome" name="Applicant Income" placeholder="Your Income...">
87
88 <label for="CoapplicantIncome">CO Applicant Income</label>
89 <input type="Number" min = 100 id="CoapplicantIncome" name="Co Applicant Income" placeholder="Your Co Applicant Income...">
```

```
input.html - Visual Studio Code
File Edit Selection View Go Run Terminal Help
input.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > input.html > ...
86 <input type="Number" min = 1000 id="ApplicantIncome" name="Applicant Income" placeholder="Your Income...">
87
88 <label for="CoapplicantIncome">CO Applicant Income</label>
89 <input type="Number" min = 100 id="CoapplicantIncome" name="Co Applicant Income" placeholder="Your Co Applicant Income...">
90
91 <label for="LoanAmount">Loan Amount</label>
92 <input type="Number" min = 0 id="LoanAmount" name="Loan Amount" placeholder="Enter the Loan Amount ...">
93
94 <label for="Loan_Amount_Term">Loan Amount Term</label>
95 <input type="Number" min = 30 max = 15000 id="Loan_Amount_Term" name="Loan Amount Term" placeholder="Enter the Term Loan Amount...">
96
97 <label for="Credit_History">Credit History</label>
98 <input type="Number" min = 0 max = 5 id="Credit_History" name="Credit History" placeholder="Enter the Your Previous Credit History...">
99
100 <label for="Property_Area">Property Area</label>
101 <select id="Property_Area" name="Property Area">
102 <option value=2>Urban</option>
103 <option value=0>Rural</option>
104 <option value=1>Semi Urban</option>
105 </select>
106
107 <input type='submit' value = 'Submit'>
108 <
109
110 </div>
111
112 </body>
113 </html>
114
```

Output.html

```
output.html - Visual Studio Code
File Edit Selection View Go Run Terminal Help
input.html x output.html x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > template > output.html > ...
1 <!DOCTYPE html>
2 <html>
3 <head>
4 <title>Home</title>
5 <style>
6 body
7 {
8     background-image: url("https://www.dbs.com/in/iwov-resources/media/images/learn/banners/what-is-a-personal-loan-1404x630.jpg");
9     background-size: cover;
10 }
11 .pd{
12 padding-bottom:45%;}
13 }
14 </style>
15 </head>
16 <body>
17 <form action="/submit" method="post">
18 <br>
19 <center><b class="pd"><font color="black" size="15" font-family="Comic Sans MS">Loan Approval Prediction</font></b></center><br>
20 <div>
21 <br>
22 <center>
23 <h2><font color="black"> {{result}} </h2>
24 </center>
25 </div>
26 </form>
27 </body>
28 </html>
29
```

App.py

```
File Edit Selection View Go Run Terminal Help
app.py - Visual Studio Code

input.html output.html app.py x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > app.py

1 import numpy as np
2 import pickle
3 import pandas
4 import os
5 from flask import Flask, request, render_template
6
7 # Create a Flask web application instance
8 app = Flask(__name__, template_folder='template')
9
10 # Load the trained model from a saved pickle file
11 model = pickle.load(open(r'model.pkl', 'rb'))
12
13 # Define a route to render the home page HTML template
14 @app.route('/')
15 def home():
16     return render_template('home.html')
17
18 # Define a route to render the input HTML form
19 @app.route('/predict', methods=["POST","GET"])
20 def predict():
21     return render_template("input.html")
22
23 # Define a route to handle form submission and display the prediction result
24 @app.route('/submit', methods=["POST","GET"])
25 def submit():
26     # Read the input values submitted by the user
27     input_feature = [int(x) for x in request.form.values()]
28     # Convert the input values to a NumPy array
29     input_feature = [np.array(input_feature)]
30     # Define the column names for the input data frame
31     names = ['Gender', 'Married', 'Dependents', 'Education', 'Self_Employed', 'ApplicantIncome']
32
33 # Sign in to Jira > No active issue > Sign in to Bitbucket 0 0 0 Activating Extensions... Ln 1, Col 1 Spaces: 4 UTF-8 LF Python 3.10.6 64-bit
```

```
File Edit Selection View Go Run Terminal Help
app.py - Visual Studio Code

input.html output.html app.py x
C:\Users\HP\Desktop> All Projects > COMPLETED > Project 5 > Flask > app.py > ...
return render_template("input.html")

22
23 # Define a route to handle form submission and display the prediction result
24 @app.route('/submit', methods=["POST","GET"])
25 def submit():
26     # Read the input values submitted by the user
27     input_feature = [int(x) for x in request.form.values()]
28     # Convert the input values to a NumPy array
29     input_feature = [np.array(input_feature)]
30     # Define the column names for the input data frame
31     names = ['Gender', 'Married', 'Dependents', 'Education', 'Self_Employed', 'ApplicantIncome',
32             'CoapplicantIncome', 'LoanAmount', 'Loan_Amount_Term', 'Credit_History', 'Property_Area']
33     # Create a Pandas data frame from the input values with the column names
34     data = pandas.DataFrame(input_feature, columns=names)
35
36     # Use the loaded model to make a prediction
37     prediction = model.predict(data)
38     # Convert the prediction from a NumPy array to an integer
39     prediction = int(prediction)
40
41     # Render the output HTML template with the prediction result
42     if prediction == 0:
43         return render_template("output.html",result="Loan will not be approved")
44     else:
45         return render_template("output.html",result="Loan will be approved")
46
47 # Start the Flask web application on port 8000
48 if __name__ == "__main__":
49     app.run(host='0.0.0.0', port=8000, debug=True)
50

# Sign in to Jira > No active issue > Sign in to Bitbucket 0 0 0 Ln 50, Col 1 Spaces: 4 UTF-8 LF Python 3.10.6 64-bit
```