PROJECT REPORT

Smart Lender - Applicant Credibility Prediction for Loan Approval

1. INTRODUCTION

1.1 PROJECT OVERVIEW

One of the most important factors which affect our country's economy and financial condition is the credit system governed by the banks. The process of bank credit risk evaluation is recognized at banks across the globe. As we know credit risk evaluation is very crucial, there is a variety of techniques are used for risk level calculation. In addition, credit risk is one of the main functions of the banking community.

1.2 PURPOSE

The prediction of credit defaulters is one of the difficult tasks for any bank. But by forecasting the loan defaulters, the banks definitely may reduce their loss by reducing their non-profit assets, so that recovery of approved loans can take place without any loss and it can play as the contributing parameter of the bank statement. This makes the study of this loan approval prediction important. Machine Learning techniques are very crucial and useful in the prediction of these types of data.

2. LITERATURE SURVEY

2.1 EXISTING PROBLEM

In reference [1], Typical data collection protocols deployed at many financial institutions for loan approval and loan pricing are reviewed. Key steps involved in improving information quality for all parties involved are discussed.

In reference [2], Decision Tree Induction Data Mining Algorithm is applied to predict the attributes relevant for credibility. A prototype of

the model is described which can be used by the organizations in making the right decision to approve or reject the loan request of the customers.

In reference [3], The approach in this study is a hybrid under sampling method that combines the clustering, the stochastic sensitivity measure and the radial basis function neural networks. A real loan default data from a P2P company in China is used to valid the performance of our method.

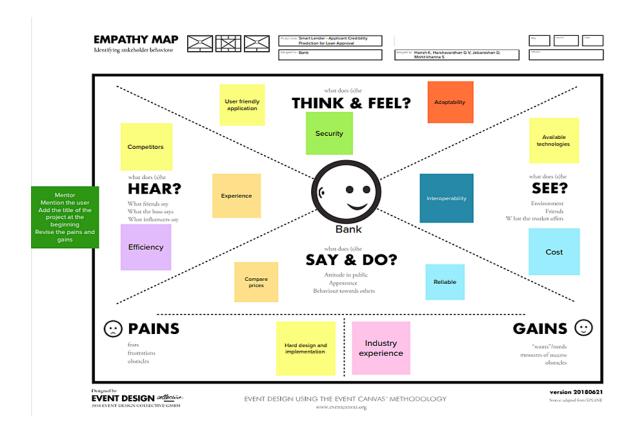
2.2 REFERENCES

- [1] M. Cary Collins, "Improving Information Quality in Loan Approval Processes for Fair Lending and Fair Pricing" 2013.
- [2] Sivasree M S, Rekha Sunny T, "Loan Credibility Prediction System Based on Decision Tree Algorithm" 2015.
- [3] Y. -Q. Chen, J. Zhang and W. W. Y. Ng, "Loan Default Prediction Using Diversified Sensitivity Under sampling," 2018.

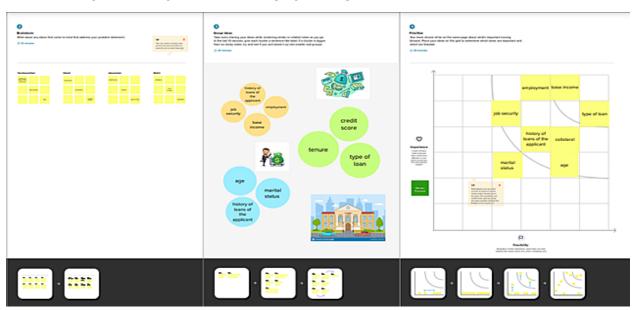
2.3 PROBLEM STATEMENT DEFINITION

Company wants to automate the loan eligibility process (real time) based on customer detail provided while filling online application form. These details are Gender, Marital Status, Education, Number of Dependants, Income, Loan Amount, Credit History and others. To automate this process, they have given a problem to identify the customers segments, those are eligible for loan amount so that they can specifically target these customers. It is a classification problem where we have to predict whether a loan would be approved or not.

3. IDEATION & PROPOSED SOLUTION 3.1 EMPATHY MAP CANVAS



3.2 IDEATION AND BRAINSTORMING

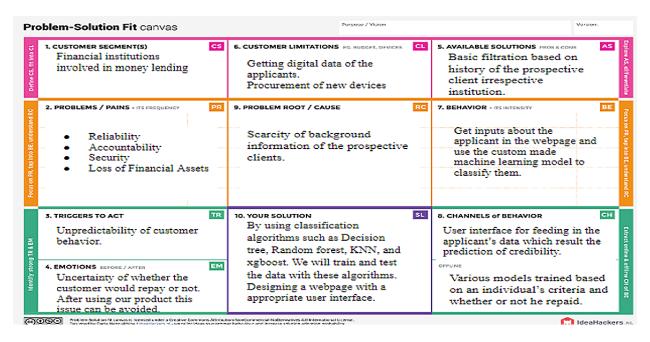


3.3 PROPOSED SOLUTION

This solution template relates the current situation to a desired result of this project and also describes the benefits acquired when the desired result is achieved

S.No.	Parameter	Description
	Problem Statement	Our objective is to automate the loan eligibility process
1.	(Problem to be	(real-time) based on customer detail provided while filling
	solved)	out online application forms. These details are Marital
		Status, Education, number of Dependants, Income, Loan
		Amount, Credit History, and others.
	Idea / Solution	Understanding the dataset and deciding on the number of
2.	description	features.
		By using classification algorithms such as Decision tree,
		Random forest, KNN, and xgboost. We will train and test
		the data with these algorithms.
		Designing a webpage with a appropriate user interface.
	Novelty / Uniqueness	Creating a interactive user interface.
3.		Including various features that are meaningful according to
		the applicant.
	Social Impact /	As the global economy depends on the banking system,
4.	Customer Satisfaction	their main problem is money supply which can be solved
		by our solution.
		This will ultimately help RBI to control the money supply
		in the market.
	Business Model	Many banks are demanding automated system for loan
5.	(Revenue Model)	approval which can significantly increase their revenue by
		reducing labour cost ,time and increasing the efficiency of
		the system
	Scalability of the	We can extend this at the people end by suggesting them
6.	Solution	the opportunities available to them to apply various types
		of loans.

3.4 PROBLEM SOLUTION FIT



4. REQUIREMENT ANALYSIS

4.1 Functional requirements

FR NO.	FUNTIONAL	SUB
	REQUIREMENT	REQUIREMENT
FR-1	Home page	Access to all other pages.
		Smart Lender application
		Credibility is shown
FR-2	User Registration	Enter email id and other personal
		details for registration
FR-3	User login	User email id and password for
		login
FR-4	Loan approval form	Credibility details should
		be entered for prediction
FR-5	Result	Display shows whether loan is
110-5	result	approved or rejected
		approved of rejected

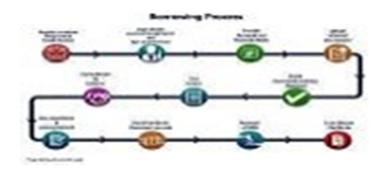
4.2 Non-Functional requirements

FR NO.	NON-FUNCTIONAL REQUIREMENT	DESCRIPTION
NFR-1	Usability	The interface we provide with must be easy to use.
NFR-2	Performance	It must produce highly accurate predictions.
NFR-3	Reliability	Predictions must stay consistent.
NFR-4	Availability	Must be ready to use whenever necessary.
NFR-5	Scalability	Must have very good prospective updates for the future.
NFR-6	Security	Individual accounts must be secure.

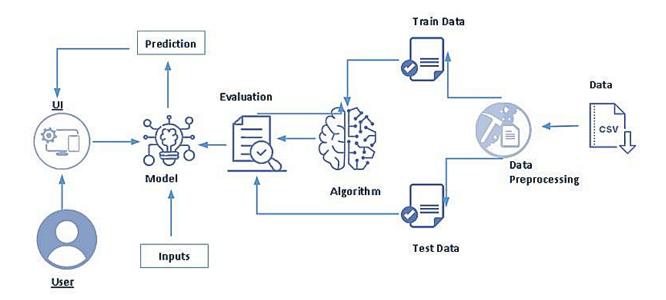
5. PROJECT DESIGN 5.1 DATA FLOW DIAGRAMS

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.



- 1. The user can register in website by using Email.
- 2. The user can Login by using Email and password as Registered in the respective website.
- 3. The user will provide personal and financial details.
- 4. User should upload the scanned documents.
- 5. Then it will goes to approval process.
- 6. Finally they will get loan closure certificate.



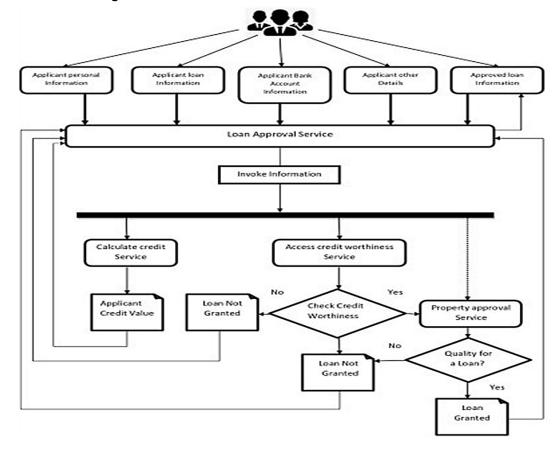
Data Flow Diagram Level 1

5.2 SOLUTION AND TECHNICAL ARCHITECTURE

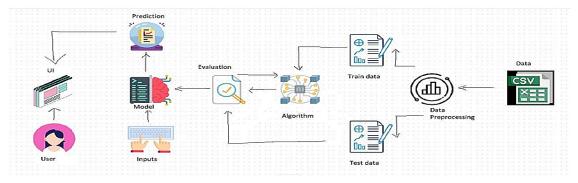
Solution Architecture:

- a. The essential objective in the financial business is to put their assets in safe hands. Thus, the framework needs to check the archives actually and ought to guarantee that as it were able individuals get the advance.
- b. The model ought to be prepared to create results with palatable precision, later which it produces precise outcomes regarding whether a borrowerought to be loaned cash or not with next to no drawn-out manual work.

- c. The clients can obtain the outcomes in the solace of their home.
- d. The framework ought to diminish chance to both the bank and the client.
- e. The model can expect results and is rapidly versatile to an extensive variety of inputs. Likewise, this system saves the financial business and its staff a huge measure of time.



Solution Architecture Diagram Technical Architecture:



5.3 User Stories

Sprint	User Story Number	User Story / Task
Sprint-1	USN-1	Download the Dataset
Sprint-1	USN-2	Visualize the Dataset
Sprint-1	USN-3	Pre-Process the Dataset
Sprint-1	USN-4	KNN Model
Sprint-2	USN-5	Decision Tree Model
Sprint-2	USN-6	Random Forest Model
Sprint-2	USN-7	XgBoost Model
Sprint-2	USN-8	Fine-Tune the Model
Sprint-2	USN-9	Evaluate and select the best Model
Sprint-3	USN-10	Model Integration with Flask
Sprint-3	USN-11	User should be able to see the interface.
Sprint-3	USN-12	Select the Type of Loan

Sprint-3	USN-13	Fill the required Applications
Sprint-4	USN-14	Register on the IBM Cloud
Sprint-4	USN-15	Train and test the ML Model
Sprint-4	USN-16	Deploy the website on IBM Cloud

6. PROJECT PLANNING AND SCHEDULING

6.1 Sprint Planning and Estimation

Sprint Number	Planned Tasks
Sprint 1	 Downloading the Dataset Visualizing the Dataset Pre-Processing the Dataset
Sprint 2	 KNN Model Decision Tree Model Random Forest XGboost Algorithm Fine-tuning the Model Evaluating the best Model
Sprint 3	 Model Integration with Flask Interface Development Loan types Formulated Prediction mechanism finalized
Sprint 4	 Register on IBM Cloud Train the Model Deploy the Model and perform prediction operations on IBM Cloud

6.2 Sprint Delivery Schedule

Sprint Number	Start Date	End Date
Sprint 1	24 Oct 2022	29 Oct 2022
Sprint 2	31 Oct 2022	05 Nov 2022
Sprint 3	07 Nov 2022	12 Nov 2022
Sprint 4	14 Nov 2022	19 Nov 2022

6.3 Reports From Jira

DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE
DONE

7. CODING & SOLUTIONING

7.1 Feature 1

Home Interface

Users are presented with an introductory home interface Webpage which has direct links to all our associated web pages.

```
<!Doctype html>
meta charset="utf-8">
title>Loan Prediction</title>
<link rel="stylesheet" href="static/home.css">
<div class="container">
 <div class="navbar">
       <a href="home.html">Home</a>
       <a href="About.html">About</a>
       <a href="procedure.html">Procedure</a>
       <a href="contact.html">Contact Us</a>
       <a href="login.html">User login</a>
       <a href="bank login.html">Bank login</a>
   <div class="content">
     <h1>Smart Lender - Applicant Credibility Prediction For Loan Approval </h1>
      Predit your loan eligibility here<br>
     <a href="prediction.html" class="btn">PREDICT</a>
     <h2>Team ID -PNT2022TMID52913</h2><br>
```

```
<h3>Team members</h3>
HARSHAVARDHAN G V
MOHIT KHANNA
JEBAROSHAN
+HARISH K
</div>
</div>
</div>
</div>
</div>
</div>
```

7.2 Feature 2

Separate Logins for potential Loan lenders and Bank Employees with their own registered IDs and Passwords

Bank Login:

```
<!DOCTYPE html>
<html>
<head>
<tittle>LogIn Page</title>
link rel="stylesheet" href="https://cdn.jsdelivr.net/npm/bootstrap@4.5.3/dist/css/bootstrap.min.css"
integrity="sha384-TX8t27EcRE3e/ihU7zmQxVncDAy5uIKz4rEkgIXeMed4M0jIfIDPvg6uqKI2xXr2"
crossorigin="anonymous">
</head>
<style>
.group{
    padding-top: 100px;
    }
</style>
<body>

</div class="container">
<div class="row">
<div style="width: 40%; margin: 25px auto;">
```

```
<div class="group">
  <h3 style="text-align: center;">Bank Login Page</h3>
  <form method="POST" action="bank1.php">
   <div class="form-group">
    <label>Bank user ID:</label><input type="text" name="BankUserName" class="form-control" autofocus</pre>
placeholder="Enter the Bank User ID" required>
   <div class="form-group">
    <label>Bank Email ID:</label><input type="email" name="bankemail" class="form-control" autofocus</pre>
placeholder="Enter the Bank Email ID" required>
       <div class="form-group">
    <label>Password:Password" name="Password" class="form-control" autofocus
placeholder="Password" required>
   <label>Enter Captcha:</label>
   <div class="form-row">
    <div class="form-group col-md-6">
     <input type="text" class="form-control" read-only id="capt" required>
    <div class="form-group col-md-6">
     <input type="text" class="form-control" id="textinput" required>
 <div class="form-group">
    <button onclick="validcap()" name="Submit" class="btn btn-lg btn-success btn-block">Submit</button>
  <h6>Captcha not visible <img src="refresh.png" width="40px" onclick="cap()"></h6>
 script type="text/javascript">
 function cap(){
  var alpha = ['A','B','C','D','E','F','G','H','I','J','K','L','M','N','O','P','Q','R','S','T','U','V'
```

```
,'W','X','Y','Z','1','2','3','4','5','6','7','8','9','0','a','b','c','d','e','f','g','h','i',
          'j','k','l','m','n','o','p','q','r','s','t','u','v','w','x','y','z', '!','@','#','$','%','^','&','*','+'];
          var a = alpha[Math.floor(Math.random()*71)];
          var b = alpha[Math.floor(Math.random()*71)];
          var c = alpha[Math.floor(Math.random()*71)];
          var d = alpha[Math.floor(Math.random()*71)];
          var e = alpha[Math.floor(Math.random()*71)];
          var f = alpha[Math.floor(Math.random()*71)];
          var final = a+b+c+d+e+f;
          document.getElementById("capt").value=final;
         function validcap(){
          var stg1 = document.getElementById('capt').value;
          var stg2 = document.getElementById('textinput').value;
          if(stg1==stg2){
           alert("Form is validated Successfully");
           return true;
          }else{
           alert("Please enter a valid captcha");
           return false;
<script src="https://code.jquery.com/jquery-3.5.1.slim.min.js" integrity="sha384-</p>
DfXdz2htPH0lsSSs5nCTpuj/zy4C+OGpamoFVy38MVBnE+IbbVYUew+OrCXaRkfj"
crossorigin="anonymous"></script>
<script src="https://cdn.jsdelivr.net/npm/bootstrap@4.5.3/dist/js/bootstrap.bundle.min.js" integrity="sha384-</p>
ho+j7jyWK8fNQe+A12Hb8AhRq26LrZ/JpcUGGOn+Y7RsweNrtN/tE3MoK7ZeZDyx"
crossorigin="anonymous"></script>
```

Customer Login:

```
<!DOCTYPE html>
<html>
<head>
```

```
<title>LogIn Page</title>
 link rel="stylesheet" href="https://cdn.jsdelivr.net/npm/bootstrap@4.5.3/dist/css/bootstrap.min.css"
integrity="sha384-TX8t27EcRE3e/ihU7zmQxVncDAy5uIKz4rEkgIXeMed4M0jlfIDPvg6uqKI2xXr2"
crossorigin="anonymous">
  .group{
    padding-top: 100px;
  <div class="container">
 <div class="row">
  <div style="width: 40%; margin: 25px auto;">
       <div class="group">
  <h3 style="text-align: center;">Login Page</h3>
  <form action="login1.php" method="POST" >
   <div class="form-group">
    <label>UserName:</label><input type="text" name="username" class="form-control" autofocus</pre>
placeholder="Enter your username or gmail ID" required="">
   <div class="form-group">
    <label>Password:</label><input type="Password" name="password" class="form-control" autofocus</pre>
placeholder="Password" required="">
   <label>Enter Captcha:</label>
   <div class="form-row">
    <div class="form-group col-md-6">
     <input type="text" class="form-control" readonly id="capt" required="">
    <div class="form-group col-md-6">
     <input type="text" class="form-control" id="textinput" required="">
 <div class="form-group">
 button onclick="validcap()" name="save" class="btn btn-lg btn-success btn-block" >Submit</button>
```

```
<h6>Captcha not visible <img src="refresh.png" width="40px" onclick="cap()"></h6>
 New Here?<a href="register.html">Register</a> 
<script type="text/javascript">
function cap(){
 var alpha = ['A','B','C','D','E','F','G','H','I','J','K','L','M','N','O','P','Q','R','S','T','U','V'
         ,'W','X','Y','Z','1','2','3','4','5','6','7','8','9','0','a','b','c','d','e','f','g','h','i',
         'j','k','l','m','n','o','p','q','r','s','t','u','v','w','x','y','z', '!','@','#','$','%','^','&','*','+'];
         var a = alpha[Math.floor(Math.random()*71)];
         var b = alpha[Math.floor(Math.random()*71)];
        var c = alpha[Math.floor(Math.random()*71)];
         var d = alpha[Math.floor(Math.random()*71)];
         var e = alpha[Math.floor(Math.random()*71)];
         var f = alpha[Math.floor(Math.random()*71)];
         var final = a+b+c+d+e+f;
         document.getElementById("capt").value=final;
        function validcap(){
         var stg1 = document.getElementById('capt').value;
         var stg2 = document.getElementById('textinput').value;
         if(stg1==stg2){
         // alert("Form is validated Successfully");
          return true;
         }else{
          alert("Please enter a valid captcha");
          return false;
script src="https://code.jquery.com/jquery-3.5.1.slim.min.js" integrity="sha384-
```

```
DfXdz2htPH0lsSSs5nCTpuj/zy4C+OGpamoFVy38MVBnE+IbbVYUew+OrCXaRkfj"
crossorigin="anonymous"></script>
<script src="https://cdn.jsdelivr.net/npm/bootstrap@4.5.3/dist/js/bootstrap.bundle.min.js" integrity="sha384-ho+j7jyWK8fNQe+A12Hb8AhRq26LrZ/JpcUGGOn+Y7RsweNrtN/tE3MoK7ZeZDyx"
crossorigin="anonymous"></script>
</html>
```

8. Testing

8.1 User Acceptance Testing and Test-Cases

Sprint 1 test Cases:

Test	case ID	Feature Type	Component	Test Scenario	Steps To Execute	Expected Result	Actual Result	Statu 5	TC for Automation(Y/N)
LoginPa	ge_TC_OO	Functional	Predict page	Verify wheather loan details entered by the user is correctly	1.Enter URL and click go 2.Click on predict button 3.Enter the details shown on the page 4.Click submit	Prediction result page should appear	Working as expected	Pass	N

Sprint 2 Test Cases:

Test case ID	Feature Type	Component	Test Scenario	Steps To Execute	Expected Result	Actual Result	Status	Comments	TC for Automation(Y/N)
LoginPage_TC_OO 1	UI	Home Page	Verify wheather user is able to see the landing page	1. Enter URL and click go	Prediction result page should appear	Working as expected	Pass		
LoginPage_TC_OO 2	Functional	Predict Page	Verify wheather loan details entered by the user is correctly received	3.Enter the details shown on the page 4.Click submit	Application should show below UI elements: - applicant_income - credit_history - dependents - education - loan_amount - loan_amcunt - married - married - property_area	Working as expected	Pass	Steps are clear to follow	N

Sprint 3 Test Cases:

Test case ID	Feature Type	Component	Test Scenario	Steps To Execute	Expected Result	Actual Result	Status	Comments	TC for Automation(Y/N)
LoginPage_TC_OO 1	UI	Home Page	Verify wheather user is able to see the landing page	1.Enter URL and click go	Prediction result page should appear	Working as expected	Pass		
LoginPage_TC_OO 2	Functional	Predict Page	Verify wheather loan details entered by the user is correctly received	2 Click on prefect button 3. Enter the details shown on the page 4.Click submit	Application should show below UI elements: - applicant_income - coapplicant_income - credit_history - dependents - education - loan_amount - loan_amt_term - married - property_area - application and the control of th	Working as expected	Pass	Steps are clear to follow	N
eaturesPage_TC_OO	Functional	Features page	Verify whether the use can see features page at the click of the button		User should see Features page User should be able to go to our Github page when they click the "GITHUB" button User should be able to navigate to the different sections of the page, including features, about and predict sections	Working as expected	Pass		N

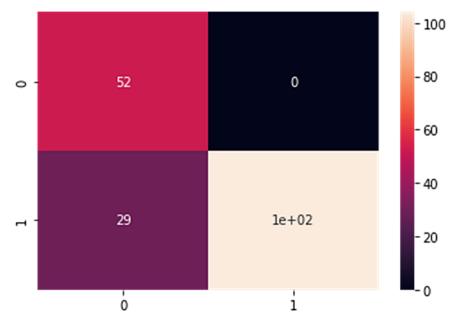
Sprint 4 test cases:

Test case ID	Feature Type	Component	Test Scenario	Steps To Execute	Expected Result	Actual Result	Status	Comments	TC for Automation(Y/N)
LoginPage_TC_OO 1	UI	Home Page	Verify wheather user is able to see the landing page	1.Enter URL and click go	Prediction result page should appear	Working as expected	Pass		
PredictPage_TC_0 02	Functional	Predict Page	Verify wheather loan details entered by the user is correctly received	1 Enter URL and cick go 2 Calcian predict (min Calcian condition) 3 Enter the details shown on the page 4 Click submit	Application should show below UI elements: applicant, income coapplicant, income credit, history dependents education loan, amount loan, amt, term married property_area	Working as expected	Pass	Steps are clear to follow	N
eaturesPage_TC_OO	Functional	Features page	Verify whether the use can see features page at the click of the button	1. Enter URL and click go 2. Click on predict button 3. Enter the details shown on the page 5. View Festures Page	User should see Features page Liber should be able to go to our Github page when they click the GITHUS* DUILD Liber should be able to navigate to the different sections of the page, including features, about and predict sections	Working as expected	Pass		N
Predictpage_TC_O O_02	Functional	Predict Page	Verify whether the user can go to predict page when they click predict button	1. Einter URL and click go 2. Click on predict button 1. Einter the details bown on the page 4. Click Go 4. Click Go 6. Click Predict button 6. Click Predict button 7. Vew predict page	User should be taken to predict page when they click predict button	Working as expected	Pass		N
Predictpage_TC_O O2	Functional	Predict Page	Verify wheather foan details entered by the user is correctly rocehed	1 Enter URL and cits go 2.Citick on predict (Citick and predict Citick on predict (Citick on predict Citick on predict Citick on predict Citick State (Citick State Citick State (Citick State Citick State Citick State Cit	Application should show below UI elements: - applicant_income - coapplicant_income - credt_history - credt_history - chizcition - loan_amcust - loan_amt_tern - married - property_trea - self_employed - sprider	Working as expected	Pass	Steps are clear to follow	N
RegisterpageTC_ _001	Functional	Register page	Verify whether use can see register page and enter details	Inter the URL and click register User should enter first name, list name and email address			Pass		N
SubmitPage_TC_ 01	Functional	Submit page	Verify whether use is able to see the submit page which displays the result of the prediction	Littler the URL and Cick register 2. User should enter first name, last name and email address 3. User should go for features page 4. User should go for features page 4. User should go to predict section and cick PREDICT button 5. User should enter cleate in predict page 6. User should enter cleate in predict page 6. User should extensive the control of the contro	User should see results of prediction on submit page	Working as expected	Pass		N

9.RESULTS

9.1 Performance Metrics

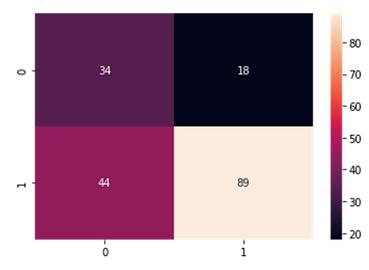
Decision Tree:



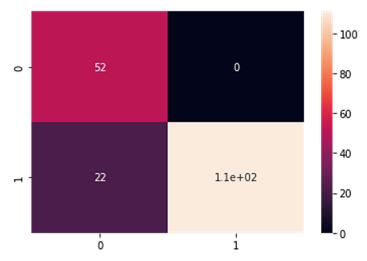
Random Forest:



KNN:



XgBoost:



10. ADVANTAGES & DISADVANTAGES

Advantages:

- i. With our solution, the prospective customers can be better analysed.
- ii. Funds allocated to be lent by the Bank would find themselves with a trustworthy customer.
- iii. The process of judging a candidate is made exponentially easier.
- iv. This system not only benefits the Banks by finding themselves reliable customers but also facilitates the latter with timely Loans
- v. Sets a standard for Financial History of an Individual.
- vi. Our chosen model Random Forest is robust to rarely occurring outliers.
- vii. Has a Low risk of Over fitting.
- viii. Works very well on large datasets

Disadvantages:

- i. Given the small dataset, the model may fail to predict the right decisions for customers with parameters of high variance.
- ii. For more accurate and real time results, we would need a dataset which contains millions of data points.

11. CONCLUSION

- a. After the Submission of test data, our model returned an accuracy of 92%.
- b. Feature engineering assisted in improving the accuracy of our model.
- c. Random forest worked better than all other decision tree, regression models.

12. FUTURE SCOPE

- Higher accuracy can be exploited by increasing the size of the dataset by generating synthetic data which can be obtained by scaling the applicant income, co-applicant income and loan amount columns and adding it to the existing dataset and testing our model on the new dataset. Although, synthetic data generation is a very tedious and difficult process, it can help achieve a better accuracy.
- User Interface can be updated with more features.
- Our Website can be integrated with social media platforms to give it a higher reach.
- Security of our customers accounts can be further increased by using 2-way logins.

13. Appendix

Source Code

Model Selection and Execution

import numpy as np import pandas as pd import pickle import seaborn as sns import matplotlib.pyplot as plt %matplotlib inline import sklearn

from sklearn.preprocessing import LabelEncoder

from sklearn.tree import DecisionTreeClassifier

 $from\ sklearn. ensemble\ import\ Gradient Boosting Classifier, Random Forest Classifier$

from sklearn.neighbors import KNeighborsClassifier

 $from \ sklearn.model_selection \ import \ Randomized Search CV$

 $from \ xgboost \ import \ XGBClassifier$

 $from\ sklearn. ensemble\ import\ Random Forest Classifier$

import imblearn

 $from\ imblearn.under_sampling\ import\ Random Under Sampler$

from sklearn.model_selection import train_test_split

from sklearn.preprocessing import scale

 $from\ sklearn.preprocessing\ import\ Standard Scaler$

from sklearn.metrics import

accuracy_score,classification_report,confusion_matrix,f1_score

```
df=pd.read csv('Loan dataset.csv')
df
df=df.drop(columns=["Loan_ID"],axis=1)
sns.distplot(df.ApplicantIncome)
plt.pie(df.Property_Area.value_counts(),[0,0,0],labels=['Semi urban','Urban','Rural'])
plt.pie(df.Education.value_counts(),[0,0],labels=['Graduate','Not Graduate'])
plt.scatter(df.ApplicantIncome,df.LoanAmount)
sns.heatmap(df.corr(),annot=True)
plt.plot(df.LoanAmount,df.ApplicantIncome,df.CoapplicantIncome)
plt.plot(df.Loan Amount Term,df.ApplicantIncome,df.CoapplicantIncome)
x=df.iloc[:,:-1]
y=df.Loan_Status
x_scale=pd.DataFrame(scale(x),columns=x.columns)
x scale.head()
sns.countplot(df.Loan Status)
rus=RandomUnderSampler(sampling strategy=1)
x res,y res=rus.fit resample(x,y)
ax=y_res.value_counts().plot.pie(autopct='%.2f')
_=ax.set_title("under-sampling")
xtrain,xtest,ytrain,ytest=train_test_split(x,y,test_size=0.3,random_state=10)
dmodel=DecisionTreeClassifier(random state=100)
dmodel.fit(x_res,y_res)
vpredd=dmodel.predict(xtest)
Rmodel=RandomForestClassifier(n estimators=100)
Rmodel.fit(x_res,y_res)
ypredR=Rmodel.predict(xtest)
kmodel=KNeighborsClassifier()
kmodel.fit(x_res,y_res)
vpredk=kmodel.predict(xtest)
xmodel=XGBClassifier(eval metric='mlogloss',n estimators=100,random state=100)
xmodel.fit(x res,y res)
vpredx=xmodel.predict(xtest)
print("Decision Tree Model Testing Accuracy")
print(accuracy_score(ytest,ypredd))
from sklearn.metrics import confusion_matrix
cf = confusion_matrix(ytest, ypredd)
import seaborn as sns
sns.heatmap(cf, annot=True)
print("Random Forest Model Testing Accuracy")
print(accuracy_score(ytest,ypredR))
from sklearn.metrics import confusion_matrix
```

```
cf = confusion_matrix(ytest, ypredR)
import seaborn as sns
sns.heatmap(cf, annot=True)
print("KNN Model Testing Accuracy")
print(accuracy_score(ytest,ypredk))
from sklearn.metrics import confusion_matrix
cf = confusion_matrix(ytest, ypredk)
import seaborn as sns
sns.heatmap(cf, annot=True)
print("Xgboost Model Testing Accuracy")
print(accuracy_score(ytest,ypredx))
from sklearn.metrics import confusion_matrix
cf = confusion_matrix(ytest, ypredx)
import seaborn as sns
sns.heatmap(cf, annot=True)
print(classification_report(ytest,ypredR))
pickle.dump(Rmodel,open('Rmodel.pkl','wb'))
pickle.dump(x_scale,open('scale.pkl','wb'))
import joblib
joblib.dump(xmodel,r"C:\Users\HP\Desktop\Rmodel.joblib")
```

GitHub

https://github.com/IBM-EPBL/IBM-Project-19400-1659697313

Project Demo Link

https://drive.google.com/file/d/1wB_a1mNMPih9VP23a4N52sXs4RpGzZLK/view?usp=sharing