

[13]:

```
import pandas as pd
import numpy as np
import matplotlib.pyplot as plt
from sklearn.metrics import roc_auc_score, roc_curve
```

[]:

```
#LOAD DATA
```

[]:

```
#PREVIEW DATA
```

[5]:

```
df1 = pd.read_csv(r"C:\Users\LENOVO\Desktop\kaggle practice data\Loan Dataset.csv")
df1.head()
```

[5]:

	Applicant_ID	Gender	Age	Marital_Status	Dependents	Education	Employment_Status	Occupation_Type	Residential_Status	City/Town
0	1	Female	25	Married	2	Graduate	Employed	Business	Own	Urban
1	2	Male	36	Married	2	High School	Employed	Business	Own	Suburban
2	3	Male	43	Single	0	Postgraduate	Self-Employed	Freelancer	Own	Urban
3	4	Female	28	Married	0	High School	Self-Employed	Freelancer	Rent	Suburban
4	5	Female	32	Single	0	Graduate	Employed	Salaried	Rent	Suburban

5 rows × 27 columns

[]:

```
#GET DATA INFORMATION
```

[17]:

```
df1.info()
```

```
<class 'pandas.core.frame.DataFrame'>
RangeIndex: 52000 entries, 0 to 51999
Data columns (total 27 columns):
#   Column              Non-Null Count  Dtype
---  -
0   Applicant_ID        52000 non-null  int64
1   Gender              52000 non-null  object
2   Age                 52000 non-null  int64
3   Marital_Status      52000 non-null  object
4   Dependents          52000 non-null  int64
```

```
4 Dependents 52000 non-null int64
5 Education 52000 non-null object
6 Employment_Status 52000 non-null object
7 Occupation_Type 52000 non-null object
8 Residential_Status 52000 non-null object
9 City/Town 52000 non-null object
10 Annual_Income 52000 non-null int64
11 Monthly_Expenses 52000 non-null int64
12 Credit_Score 52000 non-null int64
13 Existing_Loans 52000 non-null int64
14 Total_Existing_Loan_Amount 52000 non-null int64
15 Outstanding_Debt 52000 non-null int64
16 Loan_History 52000 non-null int64
17 Loan_Amount_Requested 52000 non-null int64
18 Loan_Term 52000 non-null int64
19 Loan_Purpose 52000 non-null object
20 Interest_Rate 52000 non-null float64
21 Loan_Type 52000 non-null object
22 Co-Applicant 52000 non-null object
23 Bank_Account_History 52000 non-null int64
24 Transaction_Frequency 52000 non-null int64
25 Default_Risk 52000 non-null float64
26 Loan_Approval_Status 52000 non-null int64
dtypes: float64(2), int64(15), object(10)
memory usage: 10.7+ MB
```

```
[ ]: #DESCRIPTIVE ANALYSIS
```

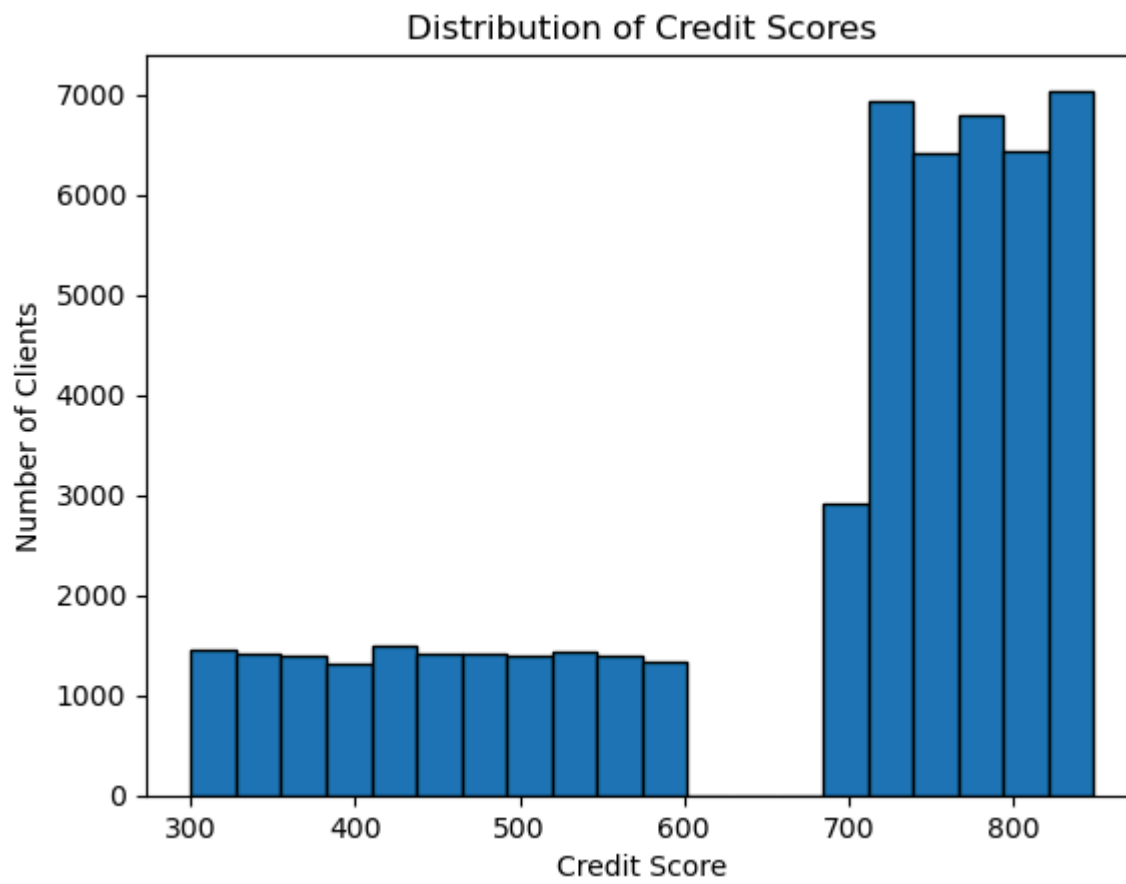
```
[21]: print("\n--- Summary Statistics ---")
      print(df1["Credit_Score"].describe())
```

```
--- Summary Statistics ---
count    52000.000000
mean      678.089019
std       159.990367
min        300.000000
25%       553.000000
50%       742.000000
75%       796.000000
max       849.000000
Name: Credit_Score, dtype: float64
```

```
[ ]: #Distribution plot
```

```
[29]: plt.hist(df1["Credit_Score"], bins = 20, edgecolor = 'black')
```

```
[29]: plt.hist(df1["Credit_Score"], bins = 20, edgecolor = 'black')
plt.title("Distribution of Credit Scores")
plt.xlabel("Credit Score")
plt.ylabel("Number of Clients")
plt.show()
```



[]: *d 1500 clients fall between 300 and 600 credit score, while on the other hand, around 3000 and above clients fall between more than 700 and 800 credit score.*

[]: *#SEGMENTATION OF CLIENT INTO SCORE BAND*

```
[37]: bins = [0, 300, 500, 700, 900]
labels = ['High Risk', 'Medium Risk', 'Low Risk', 'Very Low Risk']
df1['score_band'] = pd.cut(df1['Credit_Score'], bins=bins, labels=labels)
```

```
[39]: df1['score_band']
```

```
[37]: bins = [0, 300, 500, 700, 900]
labels = ['High Risk', 'Medium Risk', 'Low Risk', 'Very Low Risk']
df1['score_band'] = pd.cut(df1['Credit_Score'], bins=bins, labels=labels)
```

```
[39]: df1['score_band']
```

```
[39]: 0      Very Low Risk
1      Medium Risk
2      Medium Risk
3      Very Low Risk
4      Very Low Risk
...
51995   Medium Risk
51996   Very Low Risk
51997   Medium Risk
51998   Medium Risk
51999   Very Low Risk
Name: score_band, Length: 52000, dtype: category
Categories (4, object): ['High Risk' < 'Medium Risk' < 'Low Risk' < 'Very Low Risk']
```

```
[49]: print(df1["Loan_History"].describe())
```

```
count    52000.000000
mean      0.198596
std       0.398947
min       0.000000
25%       0.000000
50%       0.000000
75%       0.000000
max       1.000000
Name: Loan_History, dtype: float64
```

```
[ ]: #DEFAULT RATE BY SCORE BAND
```

```
[59]: default_rate = df1.groupby('score_band')['Loan_History'].mean().reset_index()
print("\n--- Default Rate By Score Band ---")
print(default_rate)
```

```
--- Default Rate By Score Band ---
   score_band  Loan_History
0    High Risk      0.181818
1  Medium Risk      0.200972
2    Low Risk       0.194047
3  Very Low Risk      0.198622
```

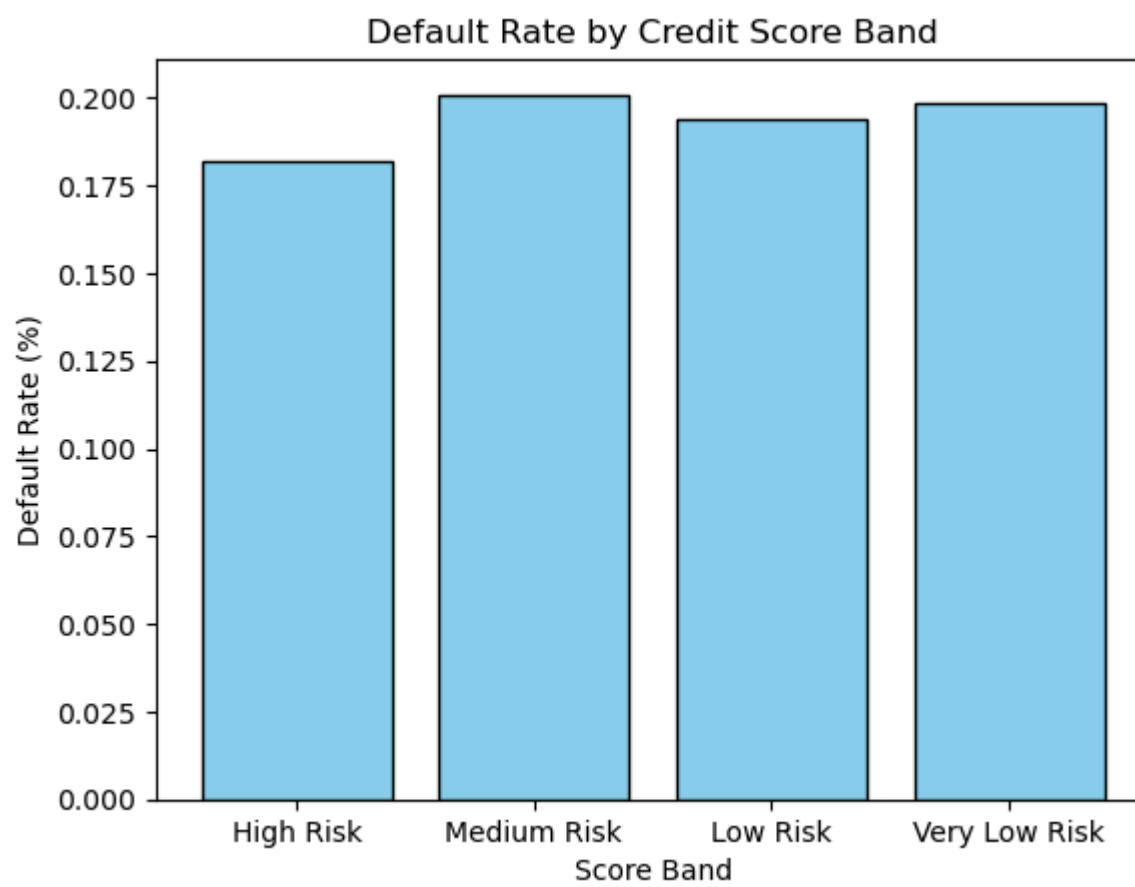
```
0    High Risk    0.181818
1    Medium Risk  0.200972
2     Low Risk    0.194047
3  Very Low Risk  0.198622
```

C:\Users\LENOVO\AppData\Local\Temp\ipykernel_3344\2684578765.py:1: FutureWarning: The default of observed=False is deprecated and in a future version of pandas. Pass observed=False to retain current behavior or observed=True to adopt the future default and si
default_rate = df1.groupby('score_band')['Loan_History'].mean().reset_index()

```
[ ]: # THE ABOVE MEANS 18% OF CLIENTS IN THE HIGH RISK BAND DEFAULTED
```

```
[ ]: # BAR CHART FOR DEFAULT RATE
```

```
[61]: plt.bar(default_rate["score_band"], default_rate["Loan_History"], color='skyblue',edgecolor='black')
plt.title("Default Rate by Credit Score Band")
plt.xlabel("Score Band")
plt.ylabel("Default Rate (%)")
plt.show()
```



```
[ ]: #Model Performance Analysis
```

```
[63]: auc = roc_auc_score(df1["Loan_History"], df1["Credit_Score"])
      print(f"\nAUC (Discriminatory Power):{auc:.3f}")
```

```
AUC (Discriminatory Power):0.498
```

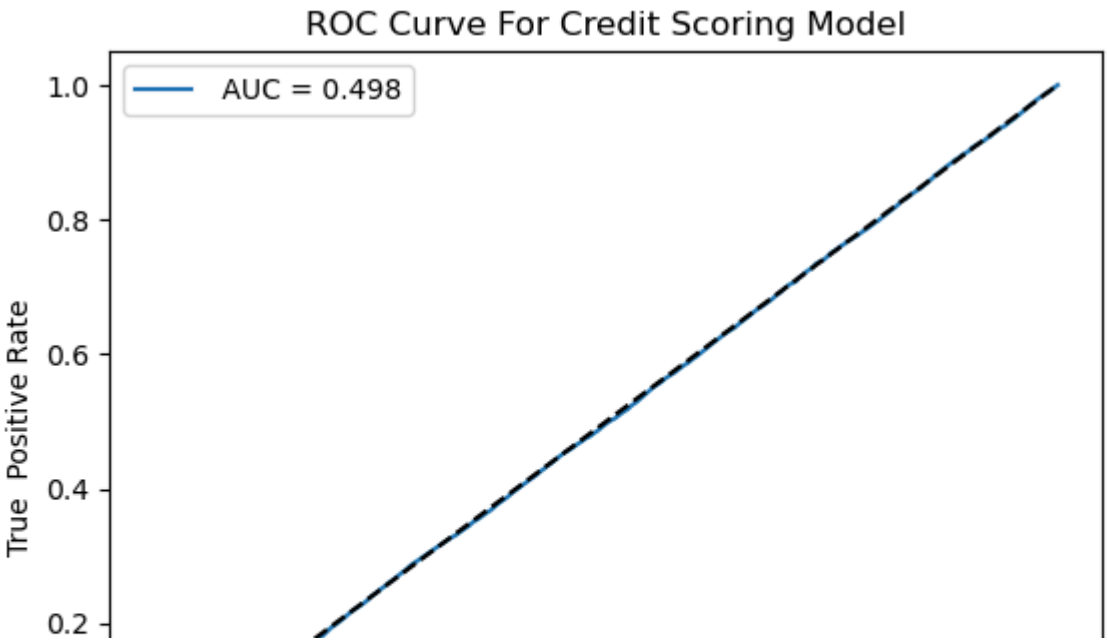
```
[ ]: #KS statistics
```

```
[69]: fpr, tpr, thresholds = roc_curve(df1["Loan_History"],df1["Credit_Score"])
      ks_statistic = max(tpr - fpr)
      print(f"KS Statistic:{ks_statistic:.3f}")
```

```
KS Statistic:0.003
```

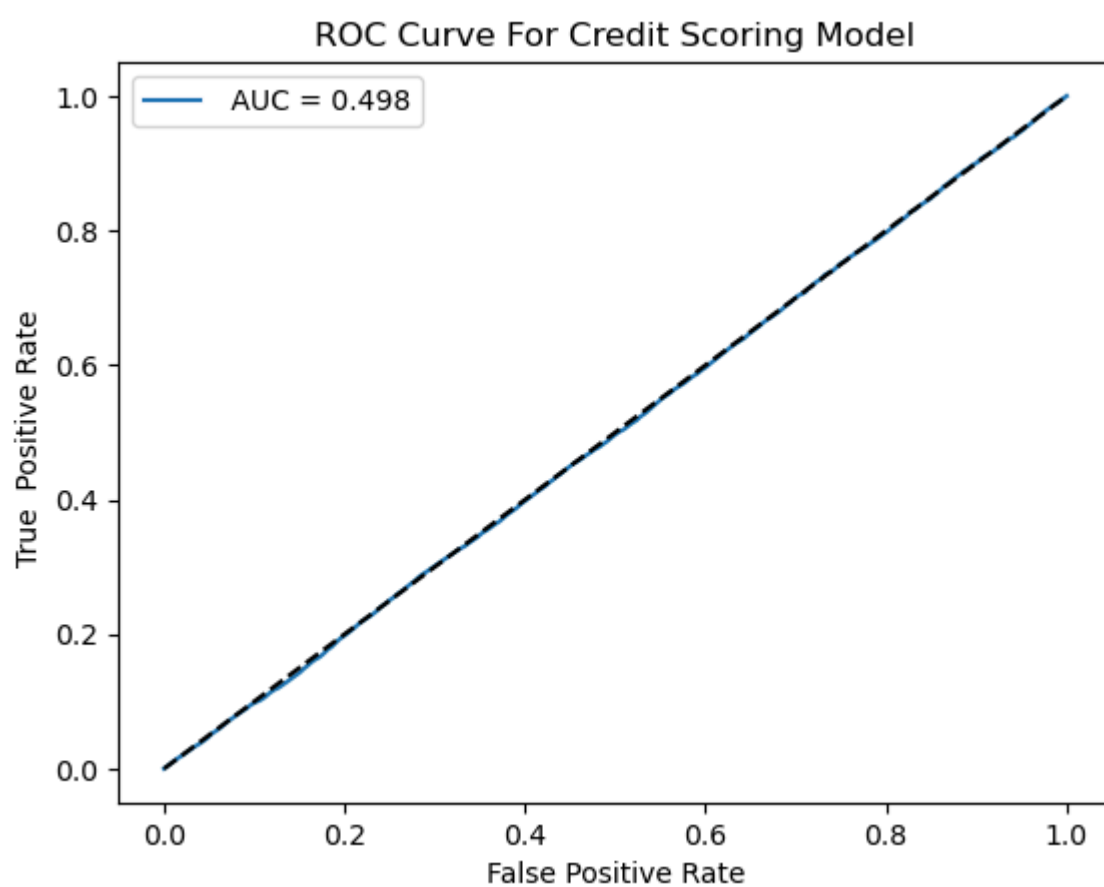
```
[ ]: #plot ROC curve
```

```
[71]: plt.plot(fpr, tpr, label=f' AUC = {auc:.3f}')
      plt.plot([0,1], [0,1], 'k--')
      plt.xlabel("False Positive Rate")
      plt.ylabel("True Positive Rate ")
      plt.title("ROC Curve For Credit Scoring Model")
      plt.legend()
      plt.show()
```



[]: `#plot ROC curve`

```
[71]: plt.plot(fpr, tpr, label=f' AUC = {auc:.3f}')
plt.plot([0,1], [0,1], 'k--')
plt.xlabel("False Positive Rate")
plt.ylabel("True Positive Rate ")
plt.title("ROC Curve For Credit Scoring Model")
plt.legend()
plt.show()
```



[]: