



CONSUMER FINANCE CASE STUDY SUBMISSION

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Abstract

- A Consumer Finance Company wants to understand the **driving factors** (or **driver variables**) behind loan default, i.e. the variables which are strong indicators of default. The company can utilise this knowledge for its portfolio and risk assessment.
- Two **types of risks** are associated with the bank's decision:
 - If the applicant is **likely to repay the loan**, then not approving the loan results in a **loss of business** to the company
 - If the applicant is **not likely to repay the loan**, i.e. he/she is likely to default, then approving the loan may lead to a **financial loss** for the company





Problem Solving Methodology

Data Cleaning

- Remove the missing columns and clean the loan dataset
- Impute the missing values

Univariate

Categorical Analysis

Identify Categorical variables and perform analysis

Univariate

Quantitative Analysis

 Identify Quantitative variables and perform analysis

Bivariate Analysis

 Perform analysis with categorical and quantitative variables against loan status

Multivariate Analysis

 Find the correlation between the identified variables from the previous analysis.

Results

- Plot the identified variables and publish the results





Univariate Analysis

Categorical Variables:

Observations of Categorical variables Variable Name **Attribute Type** Observation Term with 36 months has more number of defaults. Loan term Grade B and A has more number of defaults. grade Consumer sub_grade Consumer More defaults in all levels for the Grade B and A. Employee length greater than 10 years has some emp_length Consumer default rate. Home ownership with RENT has more default rate than Consumer home_ownership the others verification_stat Not Verified status has more defaults rate. Loan us 2011 has more defaults rate issue_d Loan Debt_consolidation has more number of defaults Consumer purpose CA and FL has more number of defaults addr_state Consumer earliest_cr_line Consumer 2000 has more defaults rate last_credit_pull_ Loan 2016 has more number of defaults

Quantitative Variables:

Observations of Quantitative variables		
Variable Name	Attribute Type	Observation
loan_amnt	Loan	Loan Amount less than 10000 has more defaults.
Int_rate	Loan	Interest rate more than 12 has more defaults
installments	Loan	Found more defaults in instalments less than 400 but no significant difference.
annual_inc	Consumer	Annual Income less than 60000 has more defaults.
dti	Consumer	Debt to Income rate more than 14% has more defaults
delinq_2yrs	Consumer	Found more default rate that has 1 or more Delinquency incidences
inq_last_6mth s	Consumer	Found more default rate that has 0 inquiries
open_acc	Consumer	One has less than 10 open accounts has more defaults.
pub_rec	Consumer	Found more default rate that has 1 or more public records
revol_util	Consumer	Revolving utilization rate greater than 50% has more defaults.





Bivariate Analysis

Categorical Variables:

Observations of Categorical variables Variable Name **Attribute Type** Observation Term with 60 months has more defaults. Loan term Consumer Grade C to G has more defaults. grade sub_grade Consumer Found more defaults in all levels for the Grade C to G. Employee length greater than 10 years has some emp_length Consumer default rate. Home ownership with RENT has more default rate than home_ownership Consumer the others verification stat Verified and Source verified status has few defaults. Loan us 2011 has more defaults rate issue_d Loan Consumer Debt consolidation has more number of defaults purpose addr_state Consumer CA and FL has more number of defaults 2000 has more defaults rate earliest_cr_line Consumer last_credit_pull_ 2016 has more number of defaults Loan

Quantitative Variables:

Observations of Quantitative variables		
Variable Name	Attribute Type	Observation
loan_amnt	Loan	Loan Amount greater than 15000 has more defaults.
Int_rate	Loan	Interest rate more than 12 has more defaults
Installments	Loan	Found more defaults in instalments greater than 400.
annual_inc	Consumer	Annual Income less than 60000 has more defaults
Dti	Consumer	Debt to Income rate more than 14% has more defaults
delinq_2yrs	Consumer	Found more default rate that has 1 or more Delinquency incidences
inq_last_6mth s	Consumer	Found more default rate that has 1 or more inquiries
open_acc	Consumer	One has less than 5 open accounts has more defaults.
pub_rec	Consumer	Found more default rate that has 1 or more public records
revol_util	Consumer	Revolving utilization rate greater than 50% has more defaults.





- 0.8

- 0.6

- 0.4

- 0.2

Multivariate Analysis

Correlation between the driver variables using Heat map:

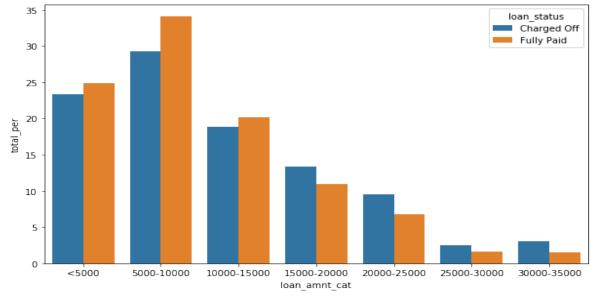


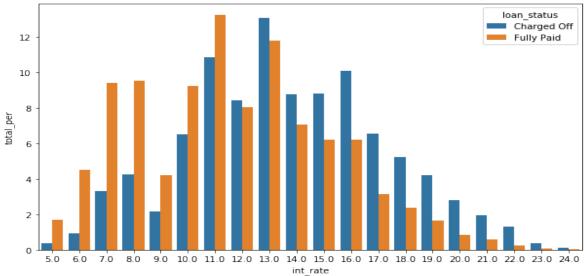




Loan Attribute Results

- From the Univariate and Bivariate analysis of loan attributes,
 - Loan Amount(loan_amnt) greater than 15000 has been observed with more defaults.
 - Interest Rate(int_rate) greater than 12 has more default rate
- Also there is a positive correlation of 30% between the Loan Amount and Interest Rate.
- Hence the Loan Amount and Interest Rate will be the most suitable driver variables behind Loan Default from loan perspective.



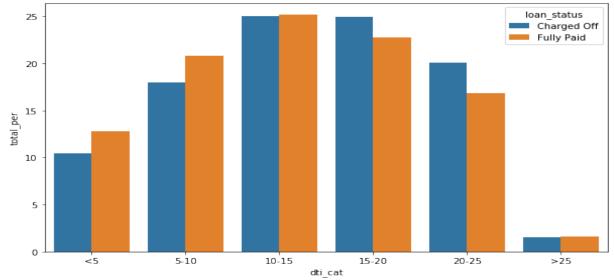


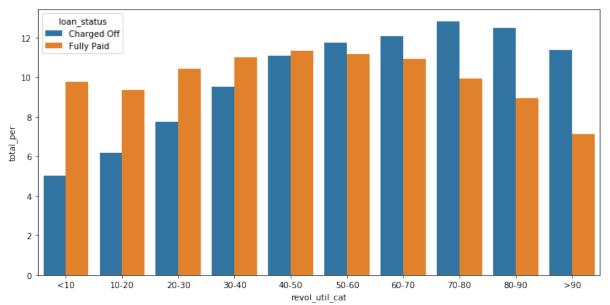




Consumer Attribute Results

- From the Univariate and Bivariate analysis of consumer attributes,
 - **Debt-to-Income(dti)** greater than **15** has been observed with more defaults.
 - Revolving_Utilization(revol_util) greater than 50% has more default rate
- There is a positive correlation of **28%** between the **dti** and **revol_util**.
- Also revol_util has a strong correlation with int rate of 47%.
- Hence the **dti** and **revol_util** will be the most suitable driving factors for Loan Default as far as consumer attributes are concerned.



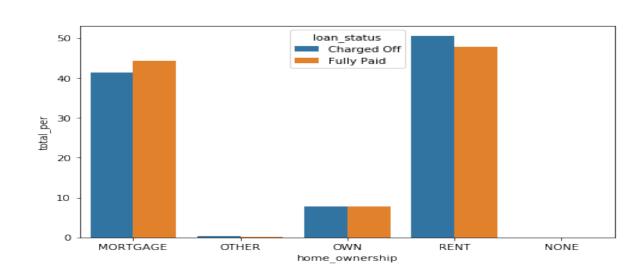


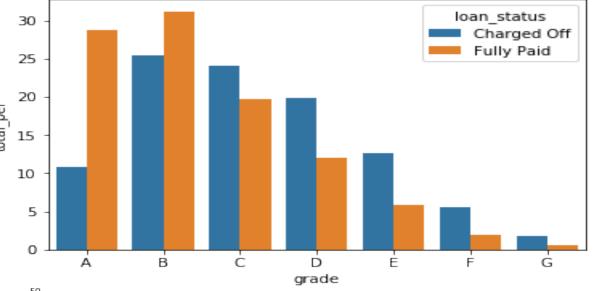


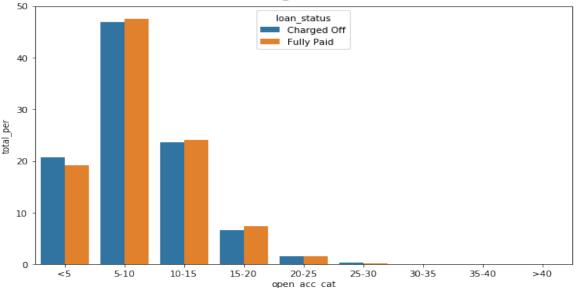


Consumer Attribute Results

- From the Univariate and Bivariate analysis of consumer attributes,
 - Grade between C and G has been observed with more defaults.
 - Open acc less than 5 has more default rate
 - Home Ownership with RENT has more defaults
- Also **Grade** has a strong correlation of **45%** with **Int_rate**.
- And Open_acc has a positive correlation of 29% with Dti.
- Hence the **Grade**, **Open_acc**, **Home_Ownership** will be the recommended driving factors for Loan Default with respect to consumer attributes.











Conclusion

The 3 main "C's of credit" for consumer are character, capacity, and collateral.

Character:

Grade is determined by the borrowers credit scores and credit history. So it can be used to understand the character of a consumer. Found that the **Grade between C and G** has more defaults.

Capacity:

Debt-to-Income(dti) and **Revolving Utilization(revol_util)** can used to measure the capacity of a consumer like how much credit is being used compared with how much credit is available.

Found that the **DTI** > 15 and **Revol_Util** > 50% has more number of defaults.

Collateral:

Open_acc and **Home_Ownership** can be used to determine the collateral of a consumer which can be used as security for repayment of a loan. Found that the **Open_acc** < 5 and **Home_Ownership** as **RENT** has more defaults.

Hence we recommend **Consumer Finance Company** to consider these driver variables which are strong indicators of default for its portfolio and risk assessment and also to determine the **loan amount** and the **interest rate** for a consumer loan.