



## Lending Club Case Study

**SUBMISSION** 

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# Lending Club: Business Objectives

- 1. Reduction in the amount of Credit Loss
  - Identify Risky Loan Applicants by identifying the strong indicators of Loan default





# **Solution Approach:**

- 1. Identify Applicant attributes
- 2. Identify Loan attributes
- 3. Find co-relation between loan status and above identified attributes





## Analysis: A High level Overview

#### Data Cleaning:

- Treating Missing Values
- Categorizing data
- Converted Data attribute into appropriate data types

#### Filter:

- •Remove records whose loan status is Current (on-going/active)
- Removed data which are indicative of customer behavior post loan disbursement.

#### Analysis:

- •Identified Loan Status as the target attribute
- Identify co-relation between target attribute and loan/customer attributes individually
- Identify co-relation between target attribute and combination different of loan/customer attributes

Plot the data and make observations

Identify the driving factors of loan default





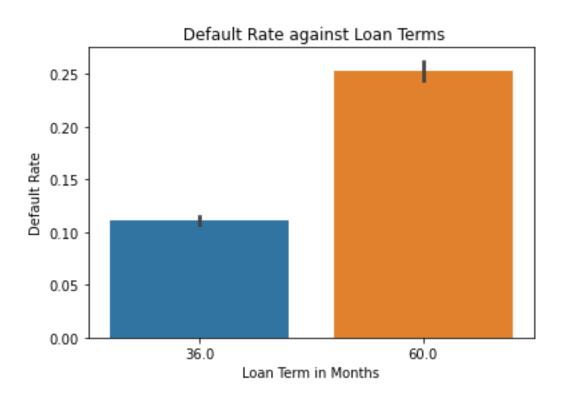
## Let's Look at Driving Factors for Loan Default

Univariate Analysis

• Let's look at loan / customer attributes individually against the Loan Default Rate



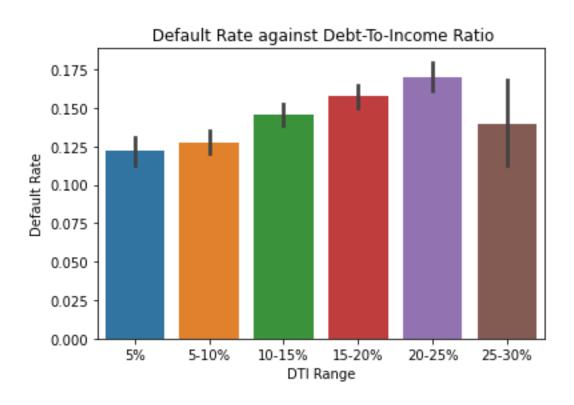




• More defaulting happens in the 60 month term even though it is only for 25% of the loans



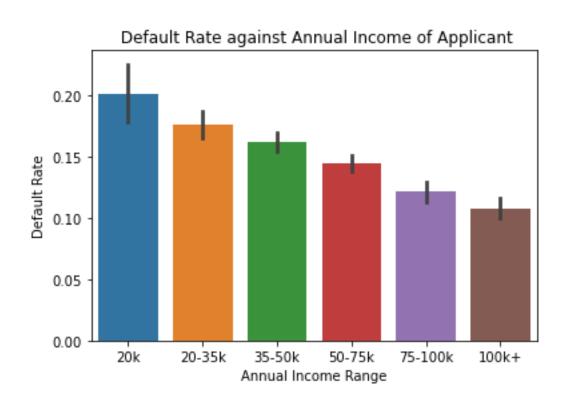




• The variation in default rate is from 12.5% to 16%. Not much of a trend.



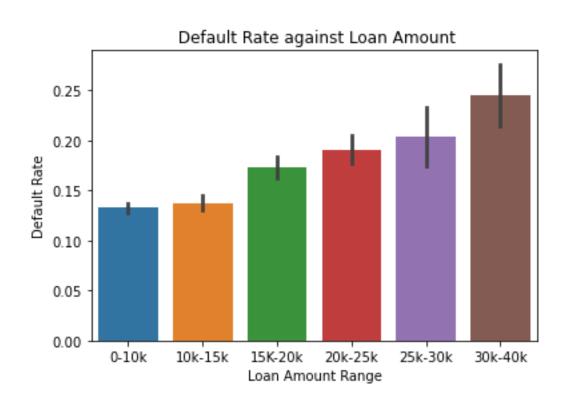




• Defaulting reduces as income increases



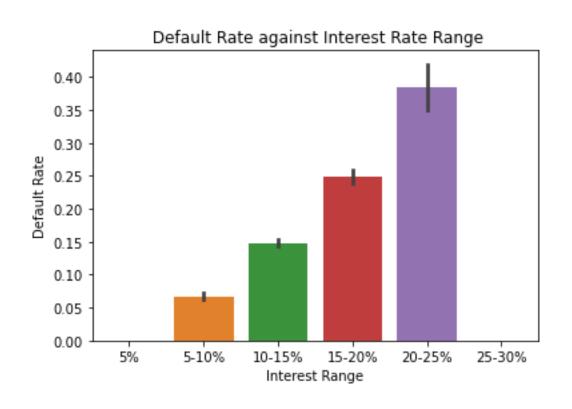




• Defaulting Increases as the Loan Amount increases



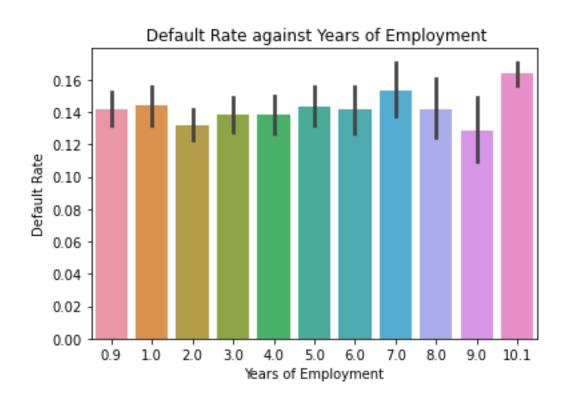




• Defaulting Increases as the Interest Rate increases



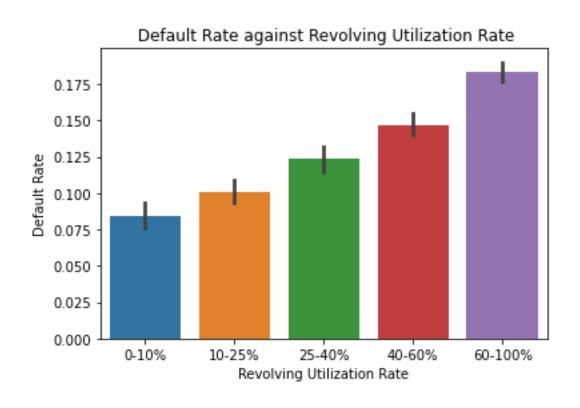




• There is not much of a trend. Defaulting is uniform across all ranges



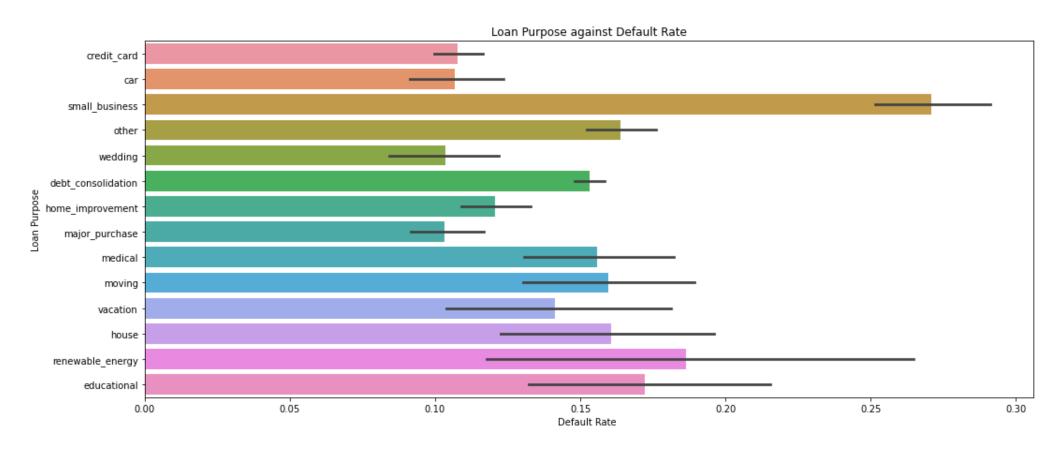




• Defaulting increases as the Revolving Utilization rate increases



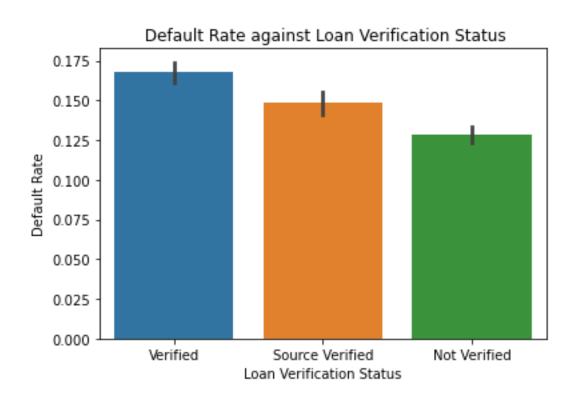




• There is a significant increase in defaulting when the purpose is "Small Business"



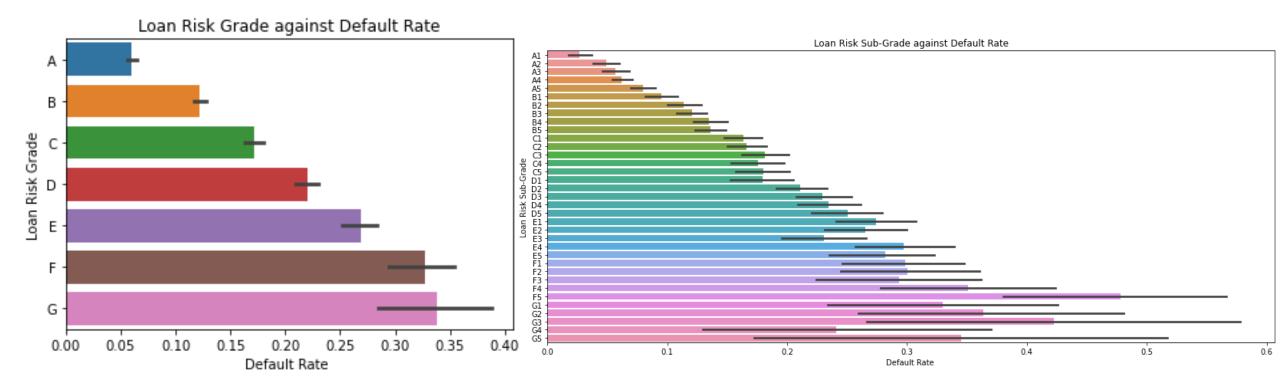




• Lending Club needs to improve the verification process since the verified accounts have more defaults than unverified



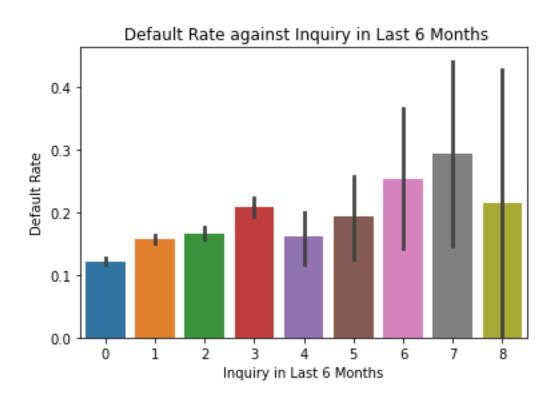




- As the grade increases, defaulting increases.
- The defaulting also increases as the subgrade increases. Some variation is seen in G grade.



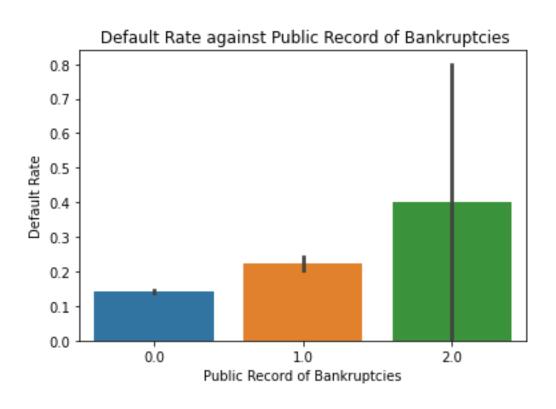




• A slight saw-tooth trend but no conclusive statement can be made







• Having 2 or more bankruptcies in the person's record should be a warning sign





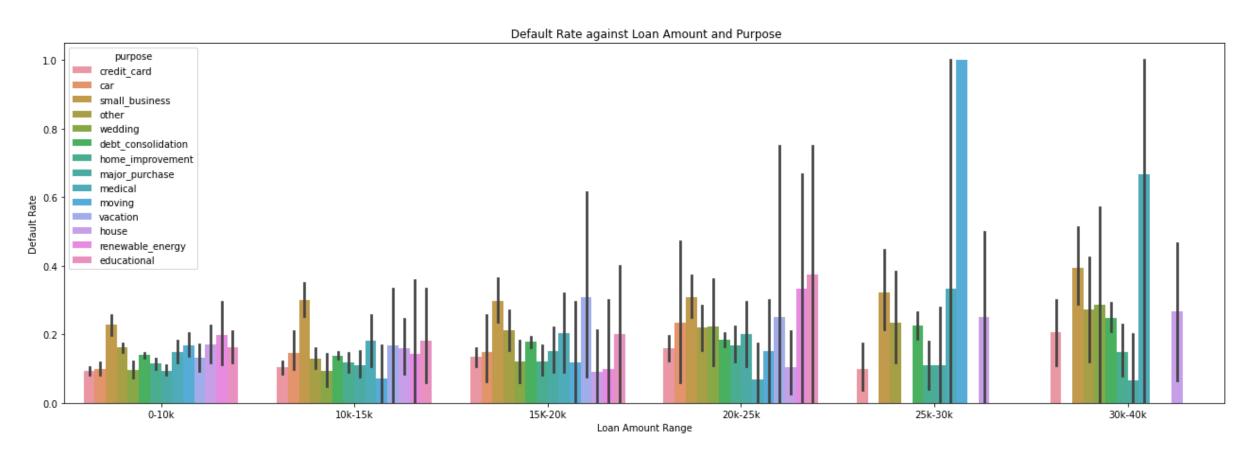
## Let's Look at Driving Factors for Loan Default

Bivariate Analysis

• Let's look at combination of loan / customer attributes against the Loan Default Rate



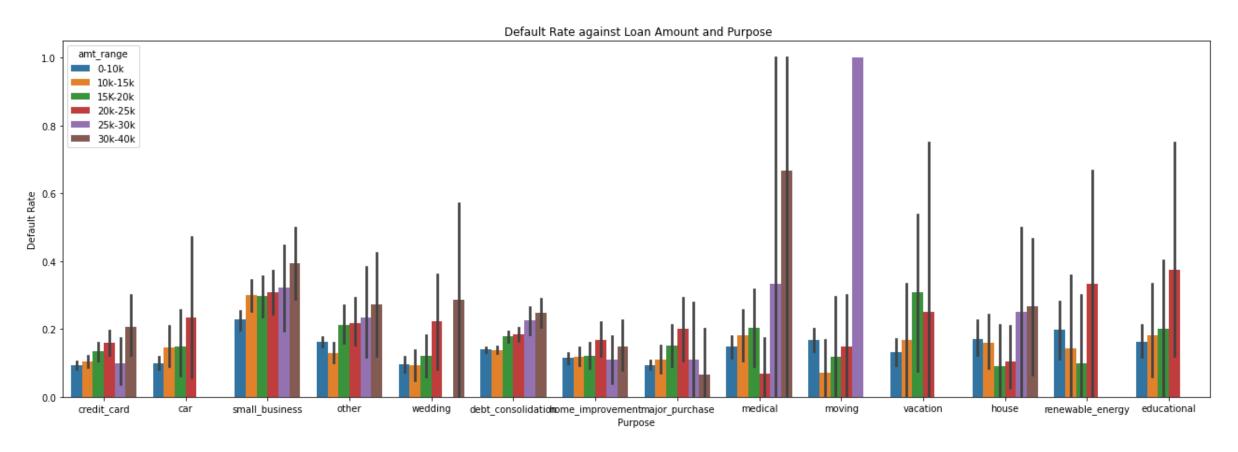




• Checking Loan Amount and Purpose. It generally seems similar across different loan amounts.



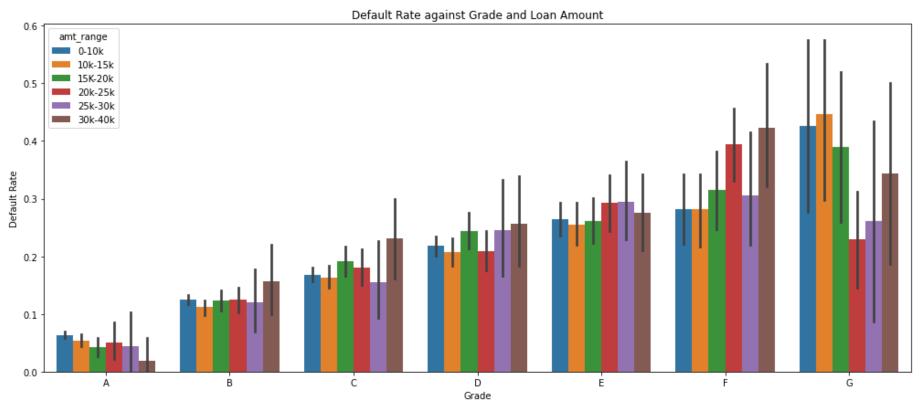




• Small business has more defaulting than other purposes for loan amount ranges



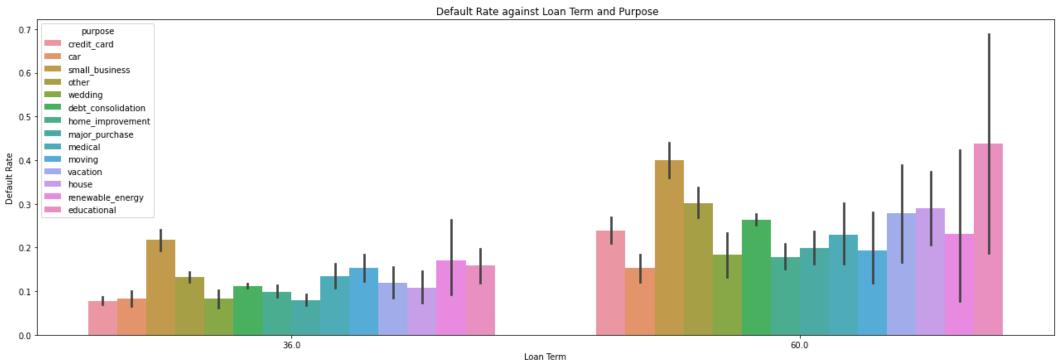




- Consider how they grade because above 20K income F grade has defaulted more than G grade
- A grade at above 30K has least default



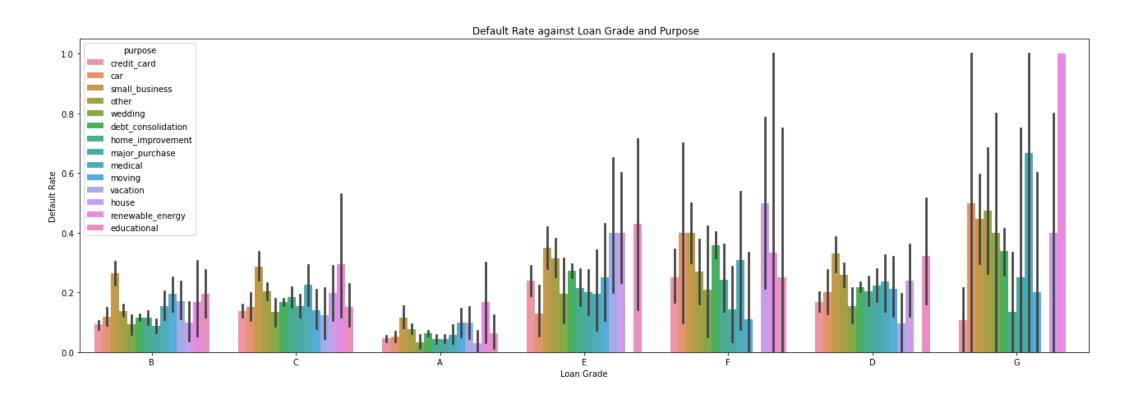




- For term with 60 months, educational loan defaulters more than doubles 0.2 to above 0.4
- similar observation for : credit\_card, small\_business(significant)
- consider giving for lesser term for all of above



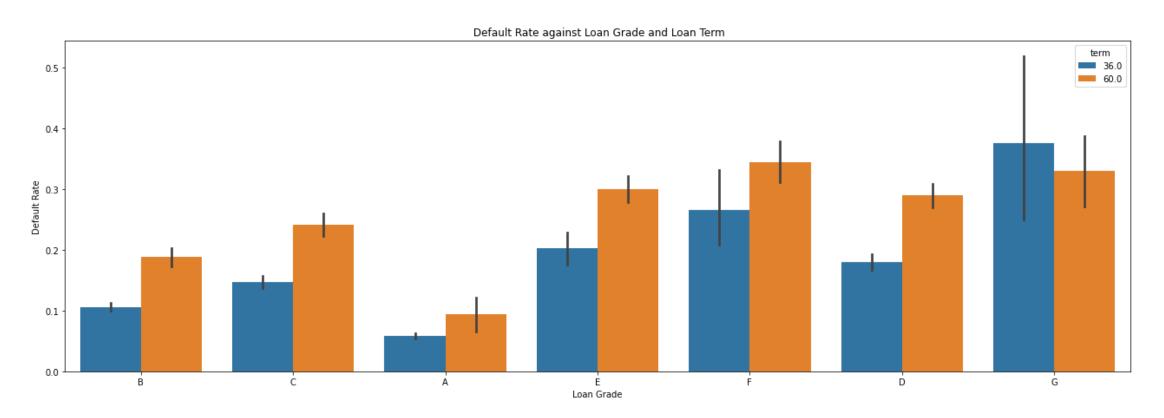




• grade is a good indicator of defaulting whatever maybe the purpose



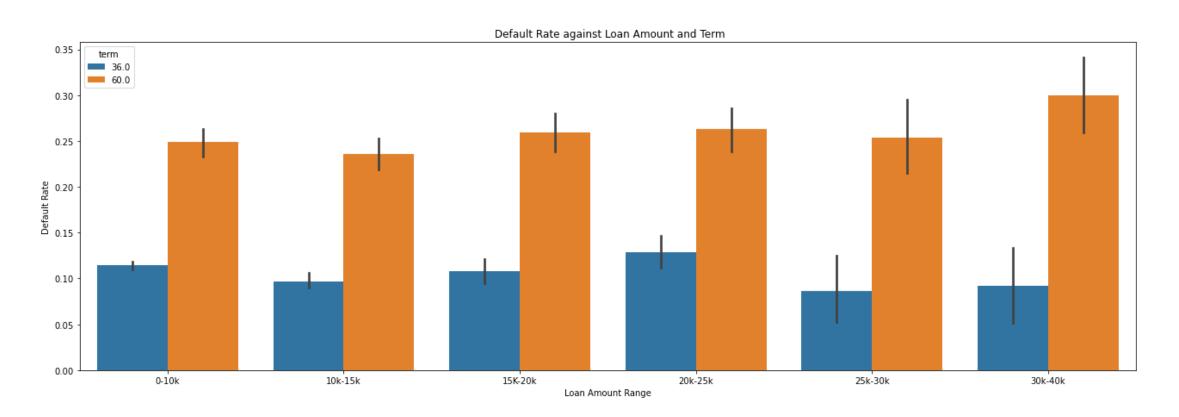




• for all grades except G, term of 60 is having more defaulter



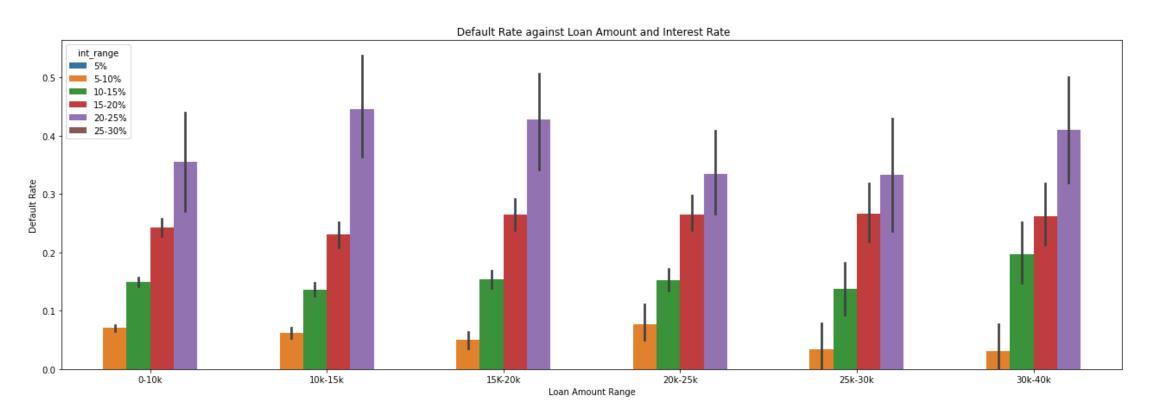




• Across all Loan Amount Range, loans with 60 month term are getting defaulted more



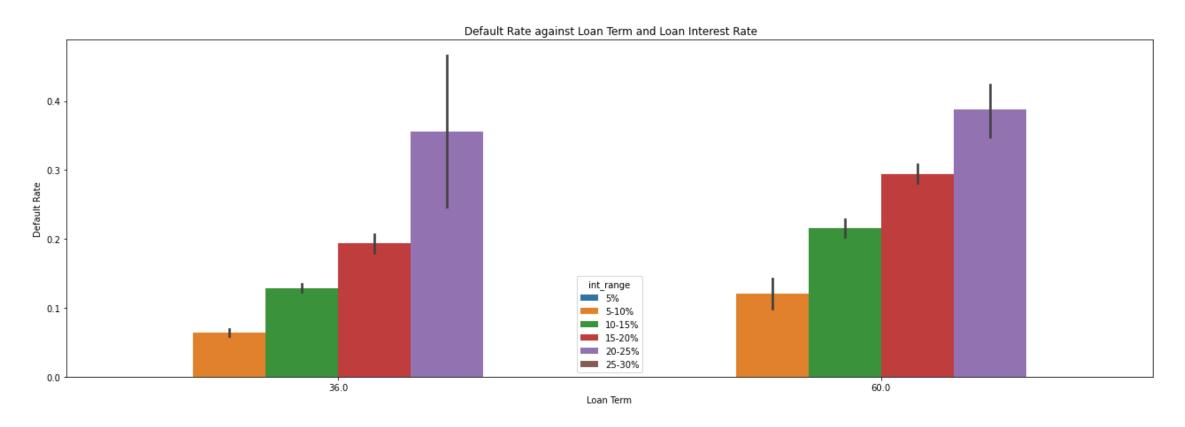




• For a given loan amount, defaulting increases as Interest rate increases



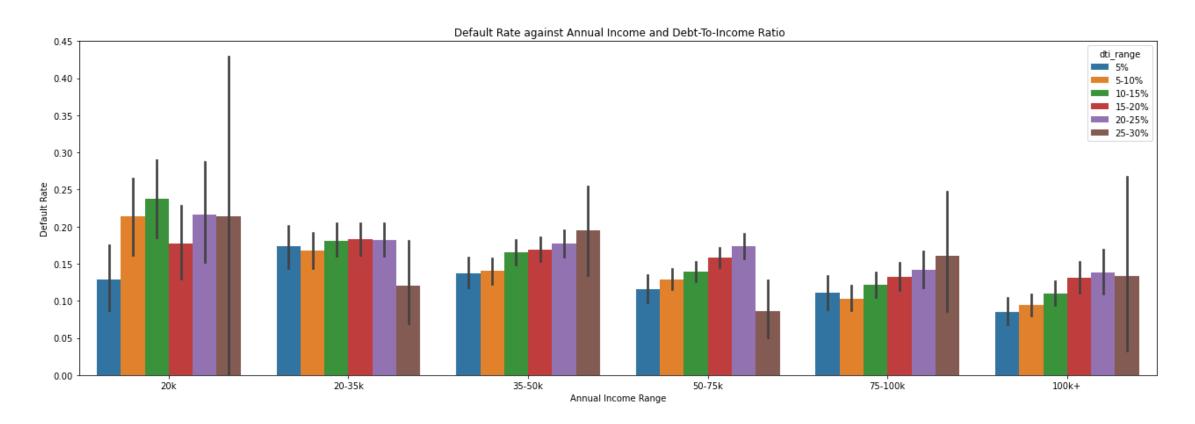




• Higher Term and higher interest rate has more defaulting



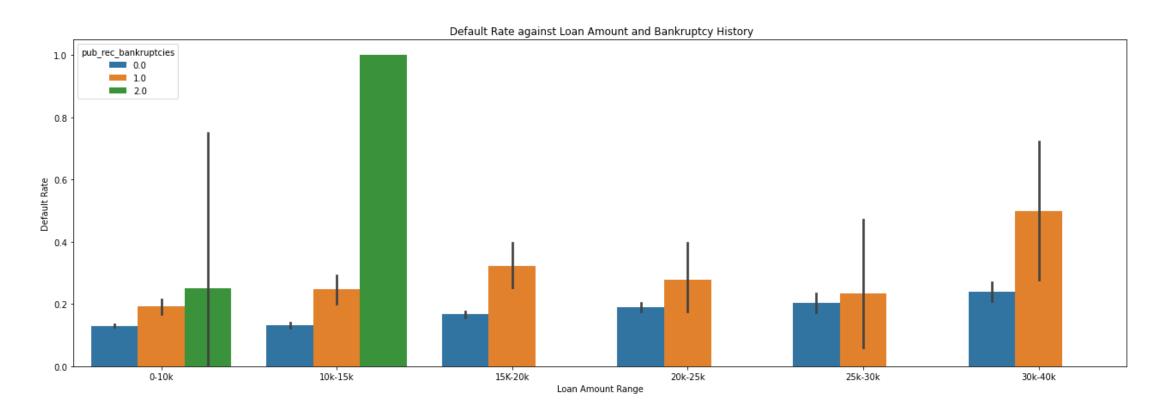




• Income Range and DTI. Not much trend, Other than what was already observed for income groups



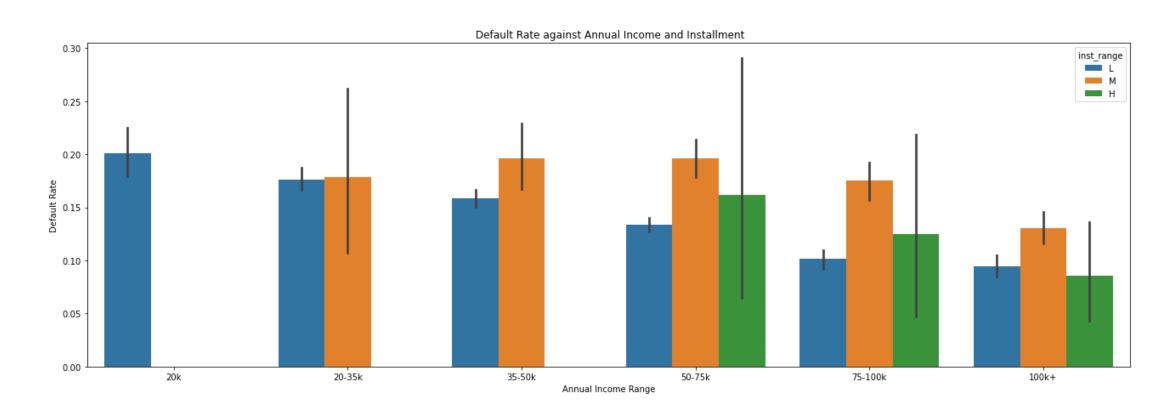




• Bankruptcies if present then it should be considered as the most risky factor for defaulting the loan







• As income increases and installment decreases, defaulting decreases





## Recommendations:

- Driving Factors:
  - Interest Rate / Grade
  - Loan Term
  - Annual Income Range
  - Revolving Utilization
  - Bankruptcies (if present, they are quite risky)
- This are the strong indicators where the loan defaulting trends are seen. So before loan approval this factors can be looked at.





## Observations:

- The verification process can be looked at as the no of people defaulting in verified are greater then those in not verified sources
- If the purpose of loan is for small business then the probability of default is higher.
- Probability of people defaulting on education loans with term 60 months is 200% more compared to that with term 36 months.
- Above 20k of annual income, F grade loans have defaulted greater then G grade loans