

# LENDING CLUB CASE STUDY

Assignment

Name:

Pruthvi Raju Vegesna



# PROBLEM STATEMENT

- A financial company which specialises in providing various types of loans to urban customers. When the company receives several loan application and has to make a decision for loan approval based on available data about applicant.
- Risks associated with the bank's decision are:
  - Applicant will repay loan completely and not giving loan will result in business.
  - Applicant may not repay loan and proving loan will lead to financial loss to company
- **Aim of this project is to identify patterns which indicate if a applicant is likely to default loan or not by doing EDA on loan and applicant attributes**
- which may be used for taking actions such as denying the loan, reducing the amount of loan, lending (to risky applicants) at a higher interest rate



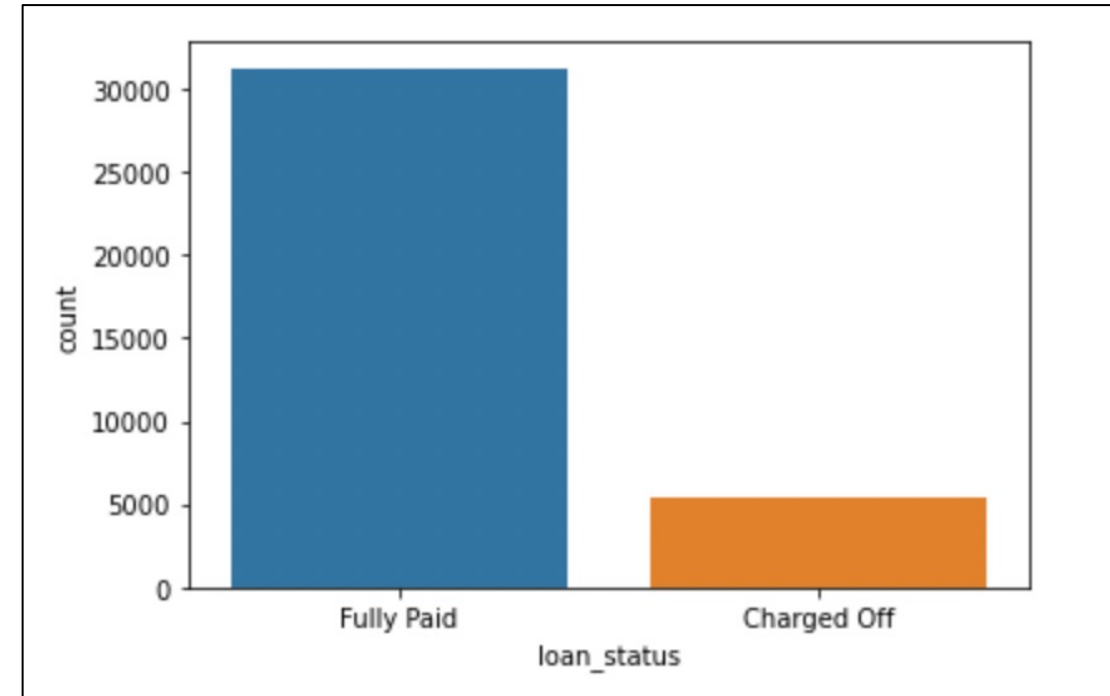
# PROBLEM SOLVING WORKFLOW

- Understanding data & Identifying target columns
- Data cleaning and manipulation
  - Fixing rows and columns
  - Handling missing data
  - Convert data to important format
  - Removed outliers
- Data analysis
  - Univariate analysis : identify top variables
  - Segmented univariate analysis : done on target column
  - Derived metrics
  - Bi-Variate analysis :to understand combined impact
- Results and Conclusions



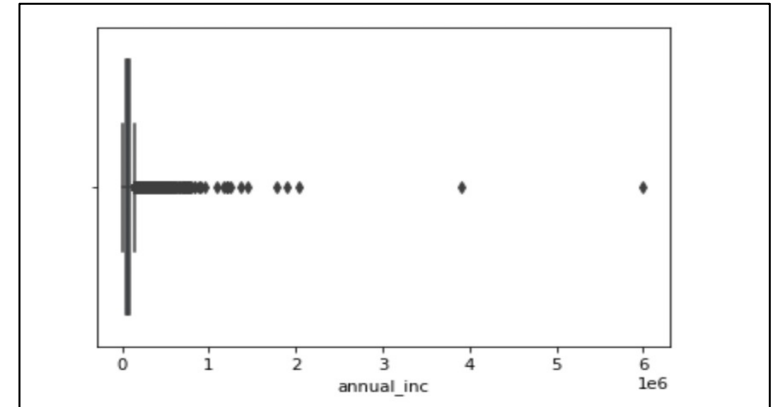
# UNDERSTANDING DATA

- Target column is loan\_status
  - %15 defaulted loans
- There are 3 types of data provide
  - Loan Attributes
  - Applicant attributes
  - Post loan attributes
- For our analysis we are interested in:
  - Loan & Applicant attributes
  - Post loan attributes don't come into picture while approving loan
  - Data with loan status as current are ignored



# DATA CLEANING AND MANIPULATION

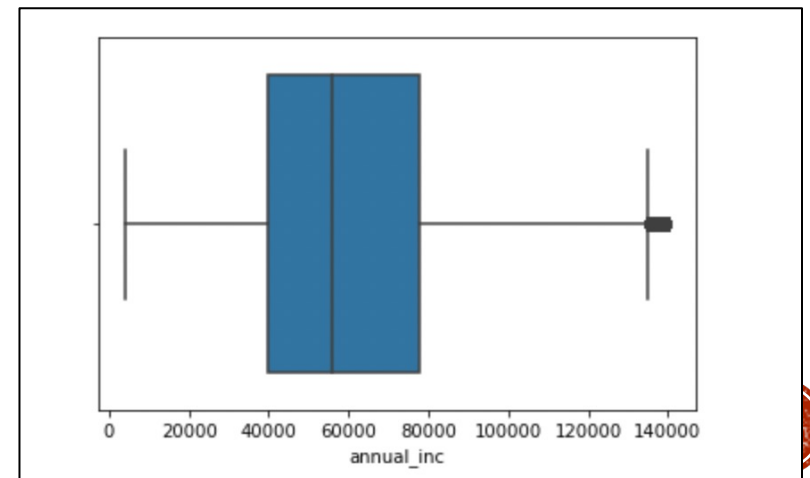
- Fixing rows and columns
  - Dropped columns with all null & all same values
  - Removing data with loan status as current
  - Removed post loan attributes
- Imputing & Handling missing data
  - Replaced data with most appropriate data
- Convert data to important format(ex: remove %, date format etc.)
  - Converted obj to numeric (ex interest rate was 9%, removed %, term from 36 months to 3years(numeric)etc )
  - Set date format
- Removed Outliers



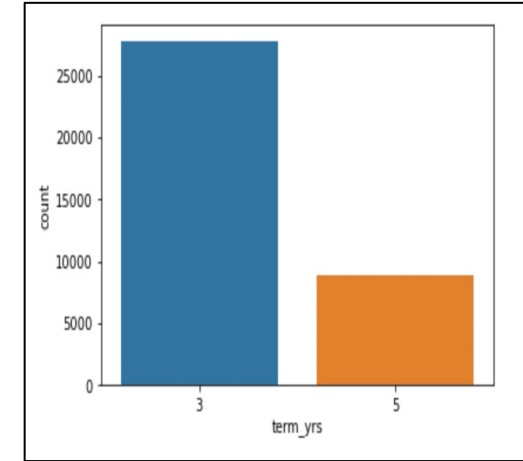
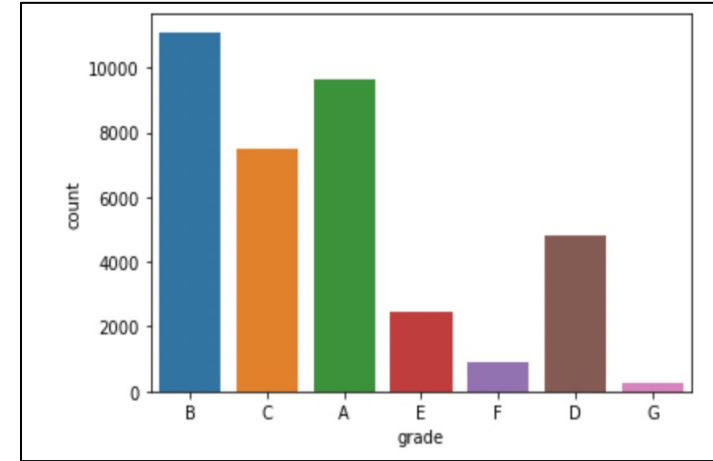
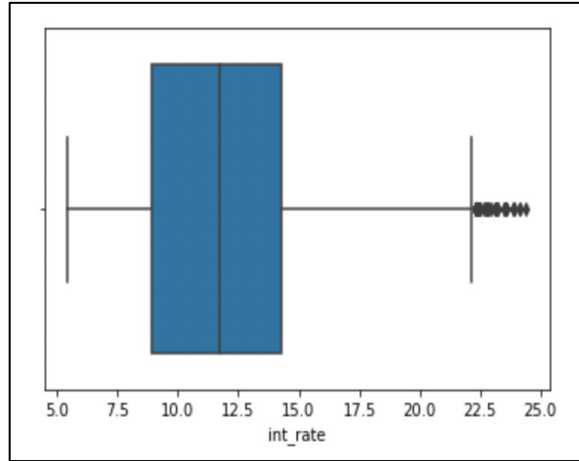
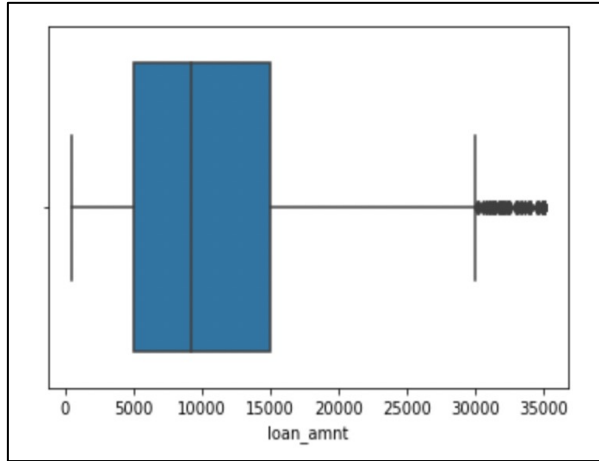
Annual  
Income



Removed  
Outliers

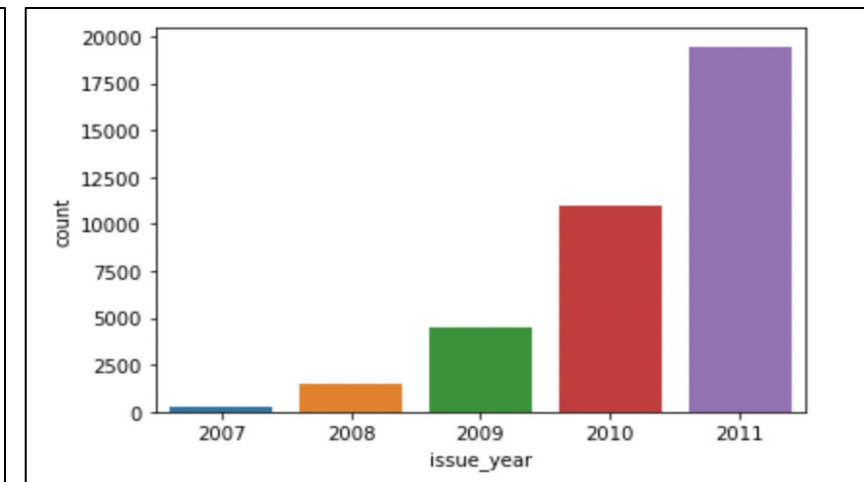
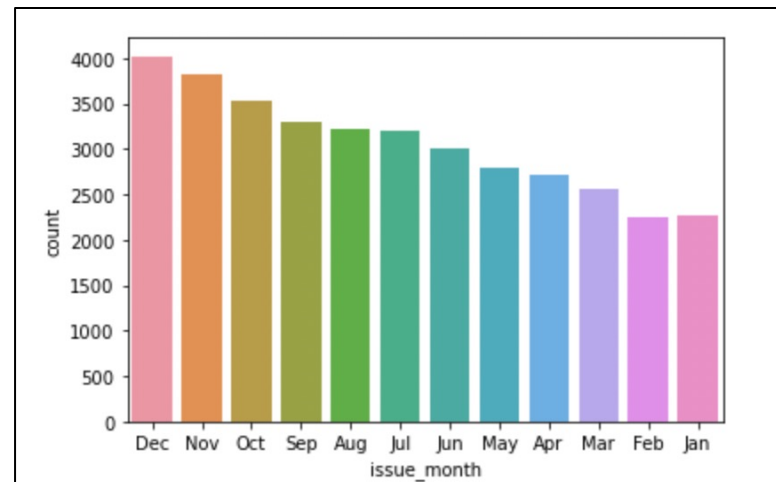


# UNIVARIATE ANALYSIS ON LOAN

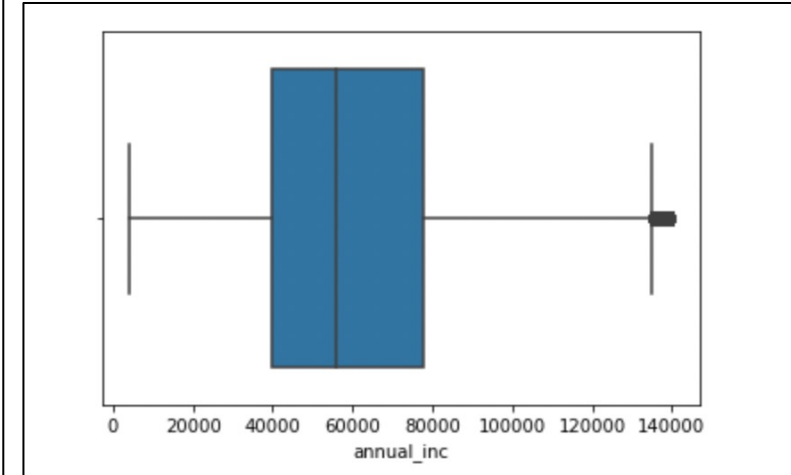
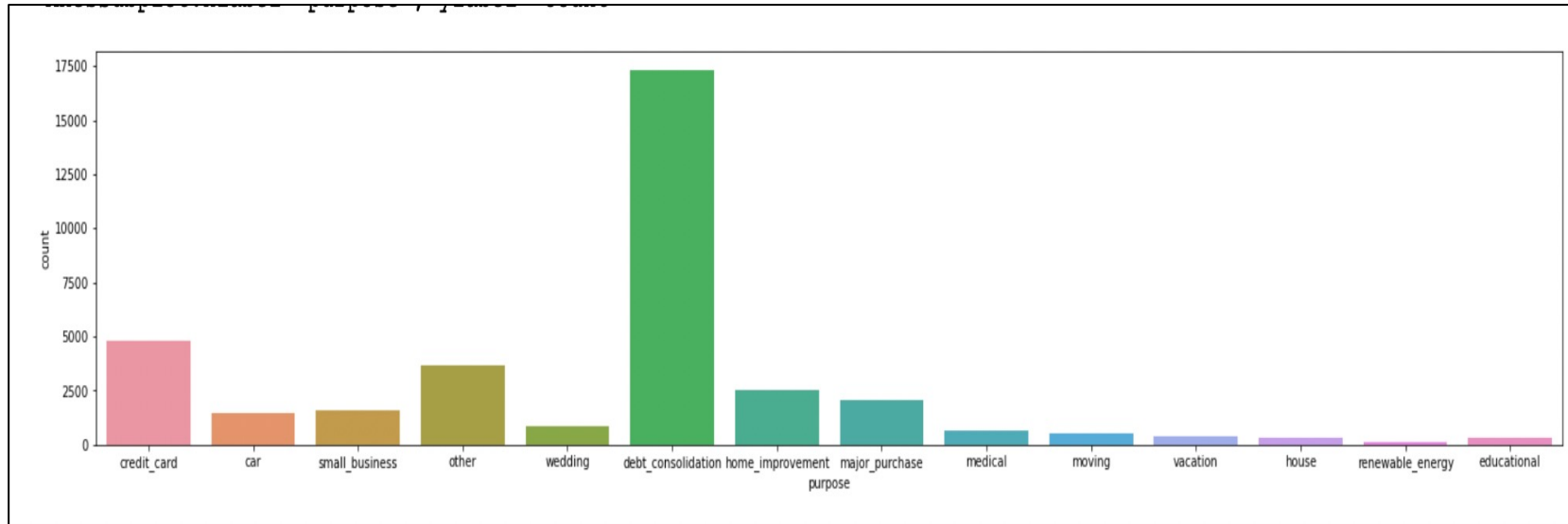


## ■ Loan Attributes(Loan):

- Average loan Amount is 9000
- Avg Interest % is 11%
- More loans are given for 3 year terms
- Loan given grade decreases from A to G number of loans decreases
- Every year number of loans increased
- Loans are given more during Dec (year end)

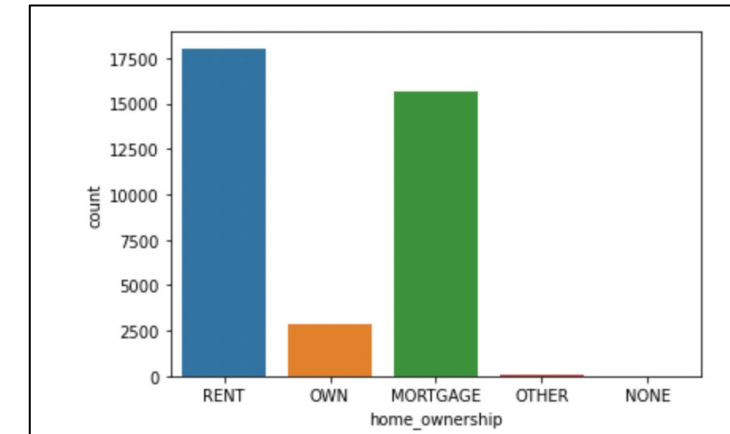
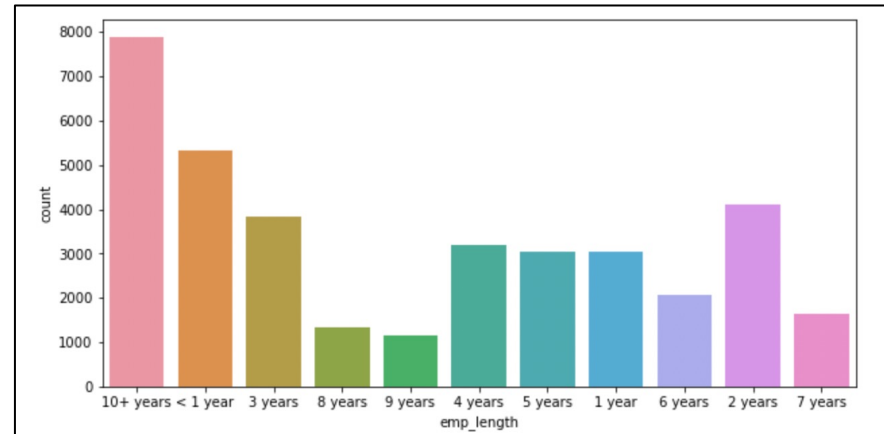


# UNIVARIATE ANALYSIS ON LOAN



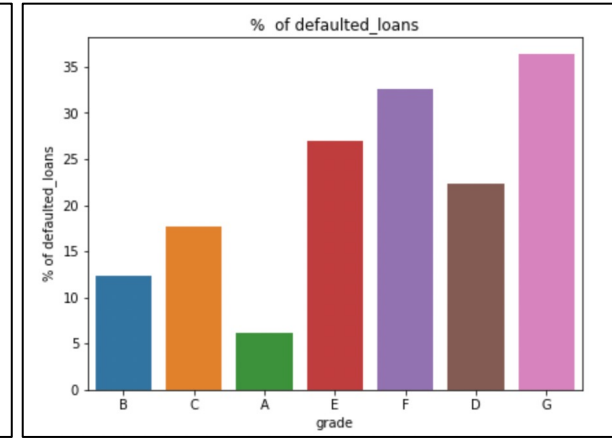
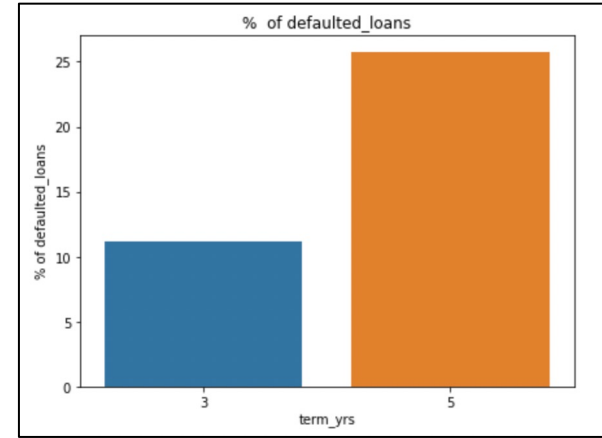
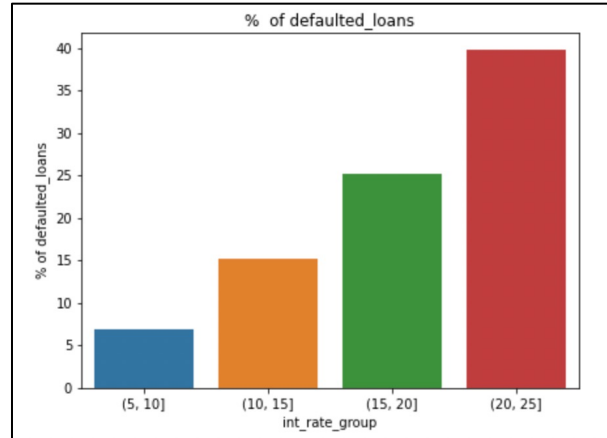
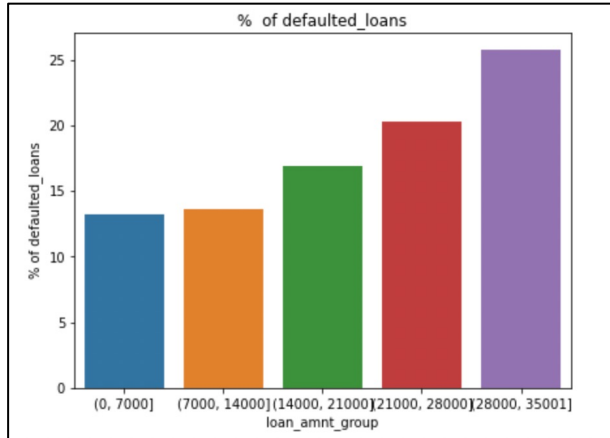
## ■ Applicant Attributes(Loan):

- Average annual income of applicants is 55000
- Applicants with <1 years and 10 yrs+ have taken more loans
- Reason for taking loan is mostly debt\_consolidation



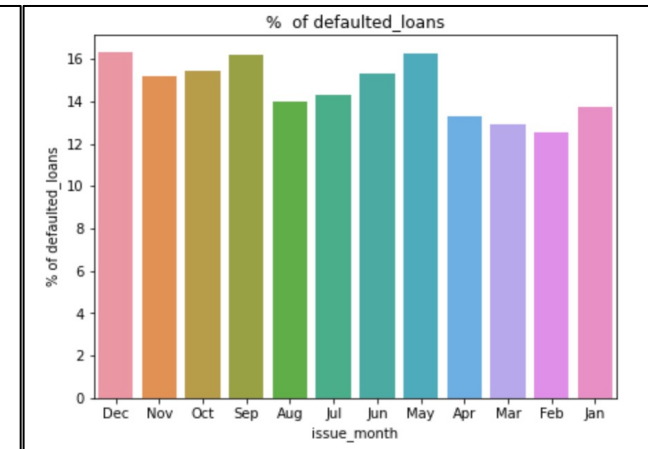
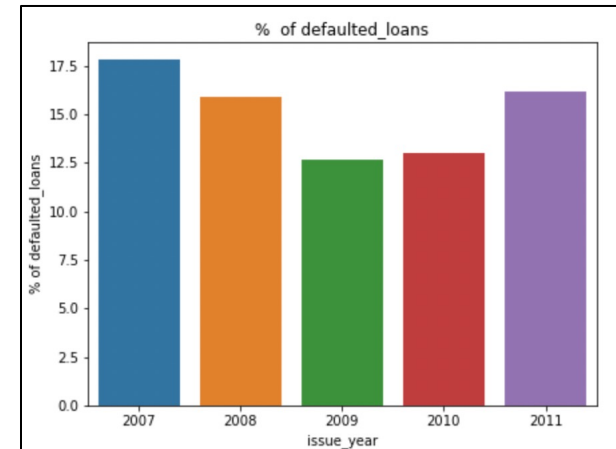


# UNIVARIATE & SEGMENTED UNIVARIATE ANALYSIS



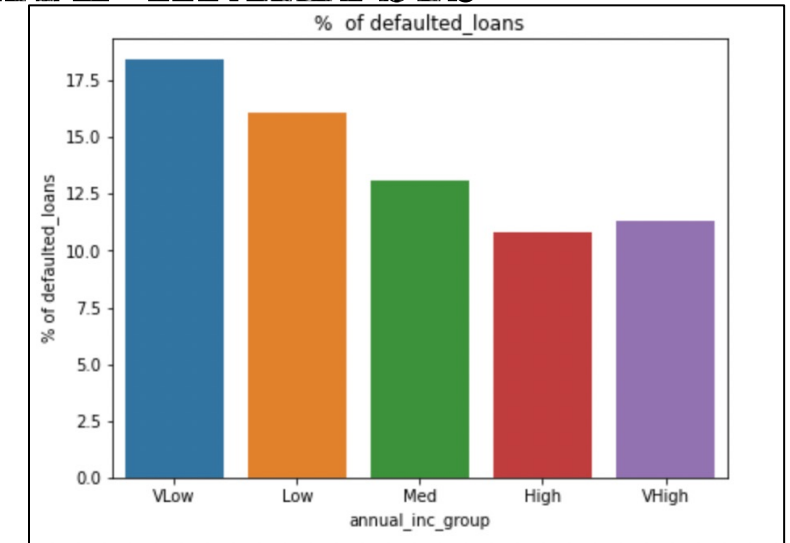
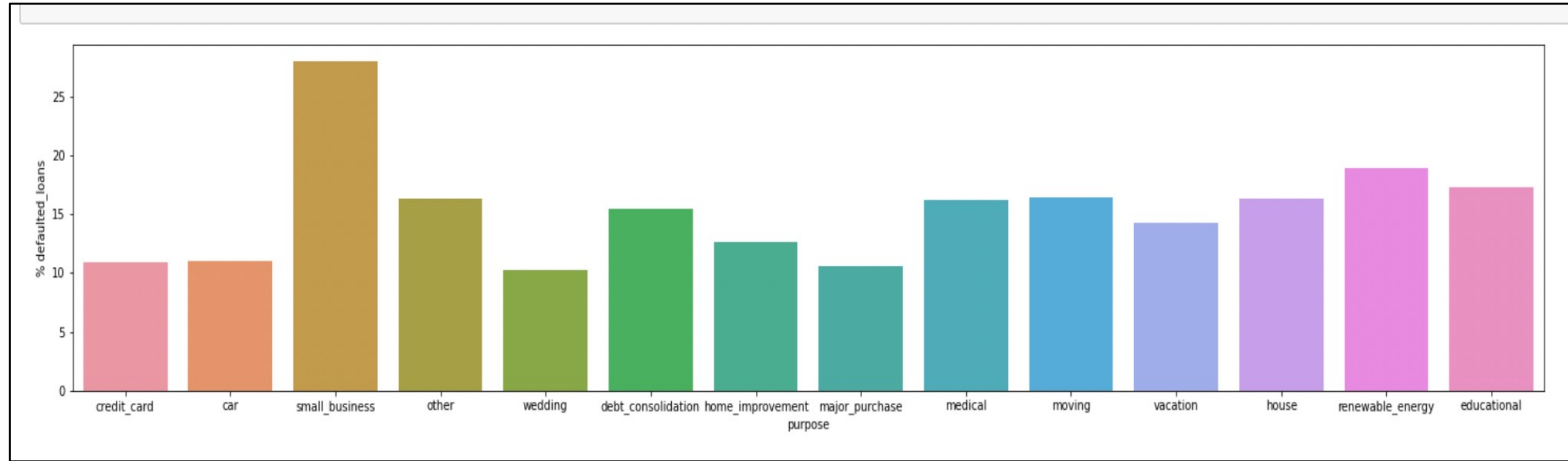
## ■ Loan Attributes(Defaulting):

- 1.) higher the loan amount higher chance of defaulting
- 2.) higher the interest higher chance of defaulting
- 3.) longer the tenure of loan higher chance of defaulting
- 4.) As Loan grade increases from A to F defaulting increase
- 4.) defaulting was low in 2008-2009-2010 might be due to effect of recession in 2008-09 where bank was more careful
- 5.) generally defaulting is higher in month of Dec



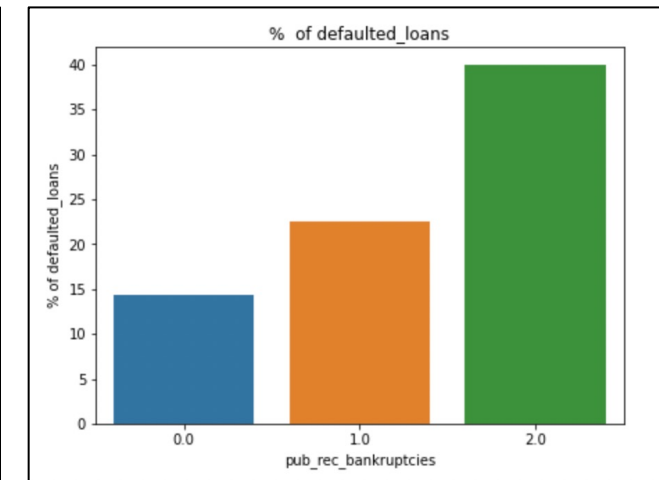
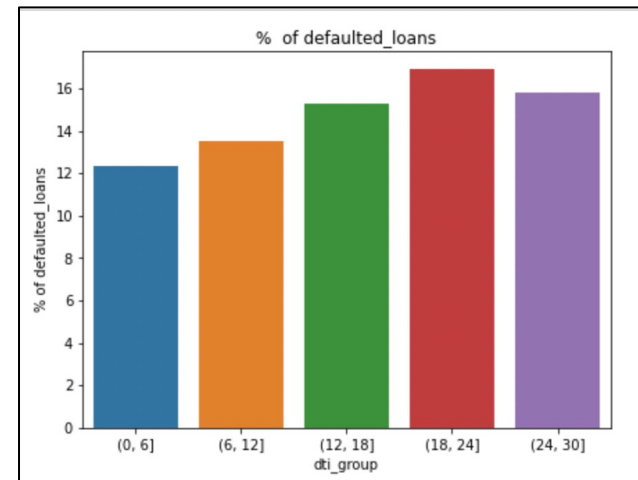


# UNIVARIATE & SEGMENTED UNIVARIATE ANALYSIS

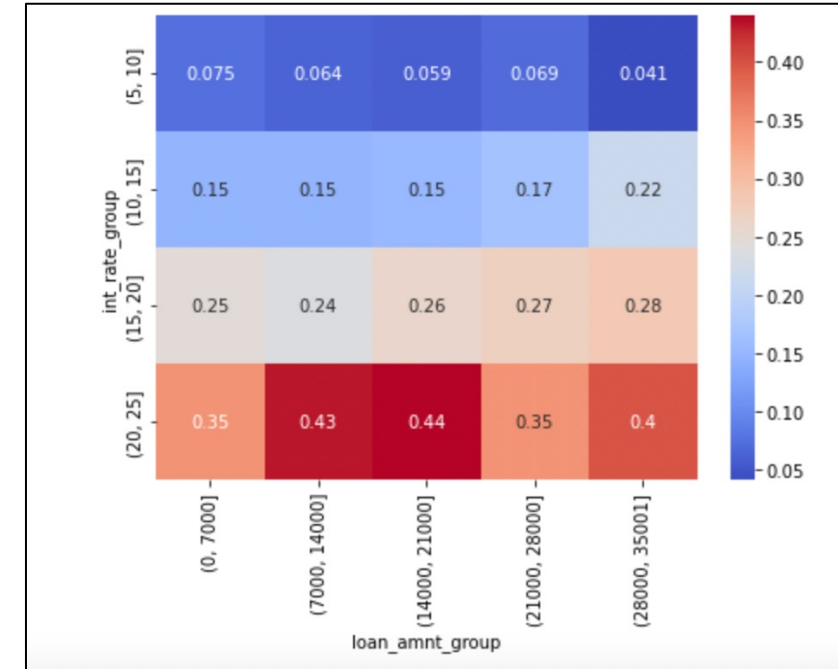
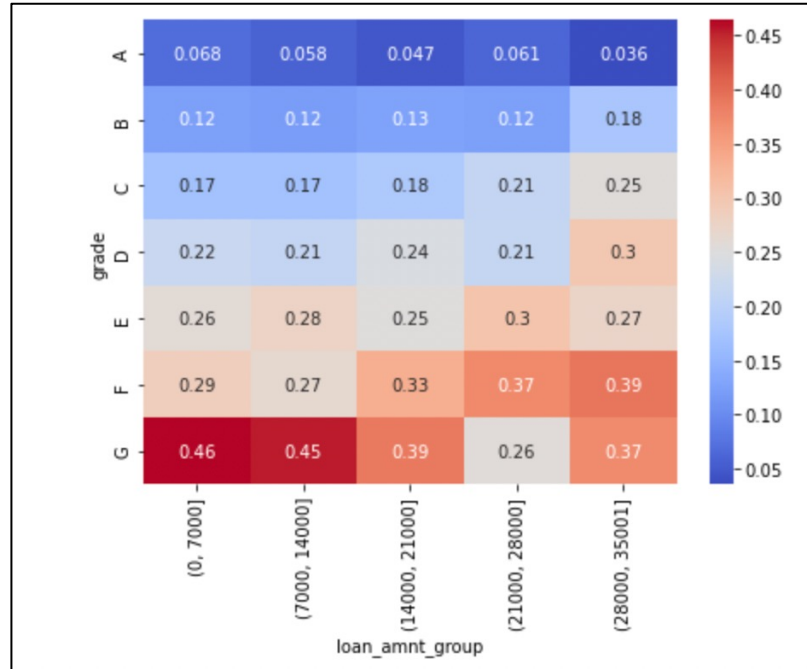
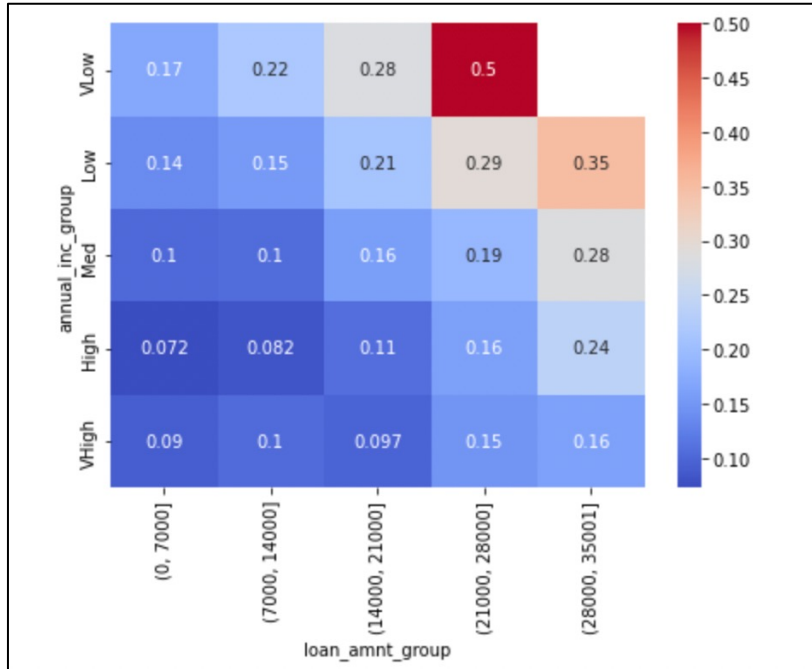


## ■ Applicant Attributes(Defaulting):

- 1.) Applicant with low annual income are likely to default
- 2.) Person with reasons as small business & Renewable energy generally tend to default higher
- 3.) person with record of bankruptcies tend to default loan
- 4.) generally as 'dti' increases defaulting increased
- 5.) Applicant address doesn't matter most of times expect for state NE can be ignored as no of loans are very low for that state and is outlier
- 6.) Applicant with more no of open accounts tends to default higher except last bin where



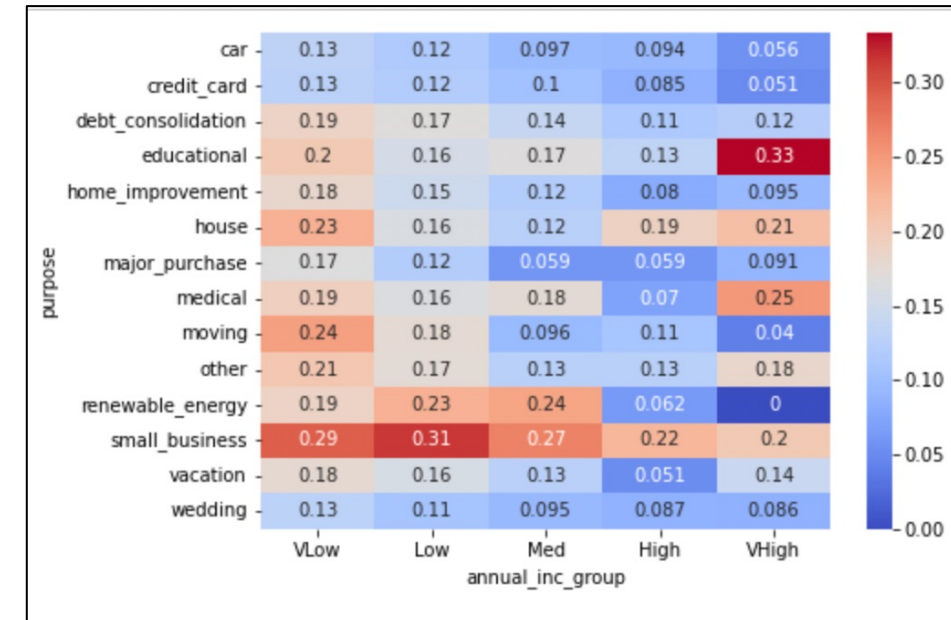
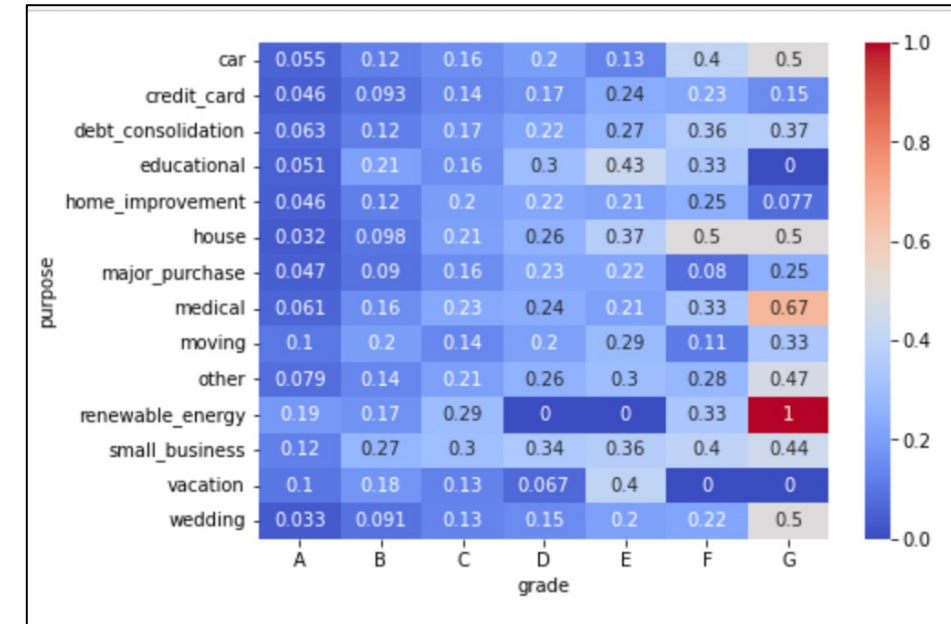
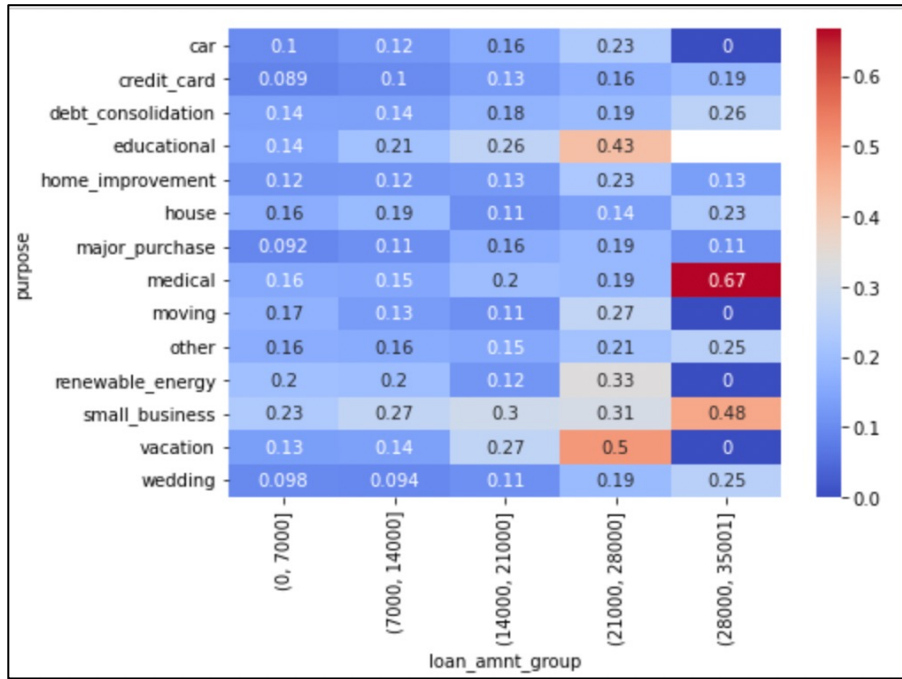
# BI-VARIATE ANALYSIS



- Loan amount and annual income tend to have combined impact
- Loan grade G and loan amount lower tend to default more



# BI-VARIATE ANALYSIS



- Applicant who take loan for (medical, small business, vacation, educational, renewable ) purpose and higher amount tend to default higher
- Applicant with grade G and medical or renewable as purpose mostly default loan
- Applicant with small business as purpose default irrespective of annual Income



# SUMMARY

- **Loan attributes** leading to defaulting :
  - Higher the interest higher the chance of defaulting
  - Higher the loan amount chance of defaulting is higher
  - Longer the tenure of loan higher chance of defaulting
  - Lower the loan grade ( Assuming G is lower compared to A), defaulting increased
- **Applicant attributes** leading to defaulting :
  - Lower the annual income of applicant higher the chance of defaulting
  - Applicant with reasons as 'small business' or 'renewable energy' tend to default loan
  - Applicant with higher 'dti' tend to default loan
  - If applicant having record of bankruptcies will most likely default loan

We see some combined impact of few variables also



**THANK YOU**

