

- **Lending Club Case Study:**
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- Team Member: Bitragunta Venkata Sai Vijay Aditya

# Lending Club: EDA Case Study

- Problem Statement :



- To Identify patterns which indicate if a person is likely to default, 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, etc.
- To find out driving factors (or driver variables) behind loan default, i.e. the variables which are strong indicators of default

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- **Data Understanding :**
- All the columns are analyzed and there meaning has been learned from Data dictionary
- Columns having more than 80% Null values are dropped
- Data set contain some Customer behavior variables such as delinq\_2yrs, collection\_recovery\_fee, last\_pymnt\_d etc. This are post loan approval variables, thus they cannot be used as predictors for credit approval. Hence they are dropped
- Data set contained some Single\_valued columns ( e.g. pymnt\_plan, collections\_12\_mths\_ex\_med, policy\_code) are also dropped.
- Few columns in dataset does not contribute to analysis, this are identified and delete ( e.g. 'id', 'member\_id', 'emp\_title', 'url' etc)

# Lending Club: EDA Case Study

- **Data Understanding :**

Columns which were considered for Analysis are as follows :

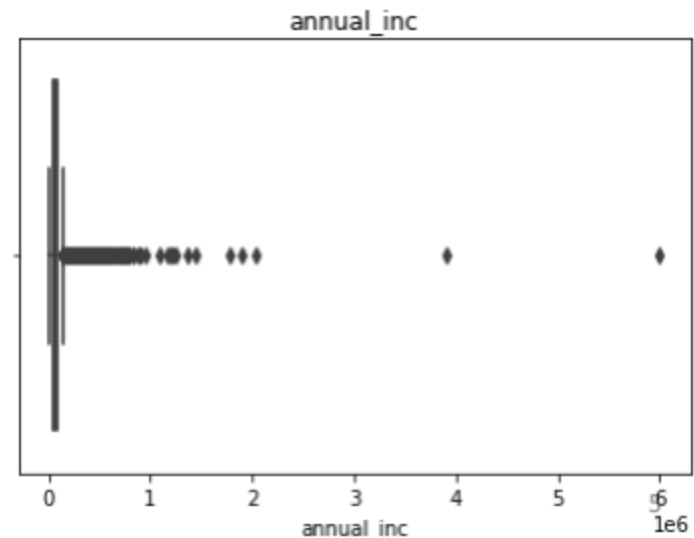
- loan\_amnt
- funded\_amnt
- funded\_amnt\_inv
- term
- int\_rate
- installment
- grade
- sub\_grade
- emp\_length
- home\_ownership
- annual\_inc
- verification\_status
- issue\_d
- loan\_status
- purpose
- addr\_state
- dti
- pub\_rec\_bankruptcies

# Lending Club: EDA Case Study

## Data Cleaning and Imputation :

- Null values present in columns have been identified and treated wherever necessary
- Data is segmented into Continuous and categorical variables
- Boxplots are plotted for continuous variables to check presence of outliers
- For Simplification purpose, binning is done for few continuous variable

It is observed that, annual\_inc column has very uneven distribution due to outliers, hence data beyond 95 percentile is dropped

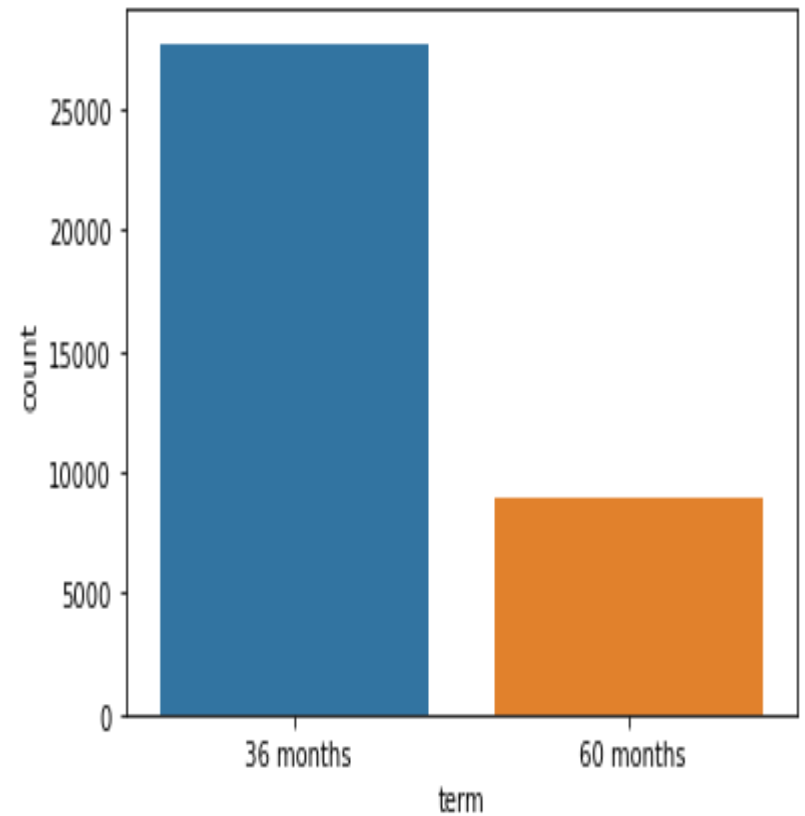
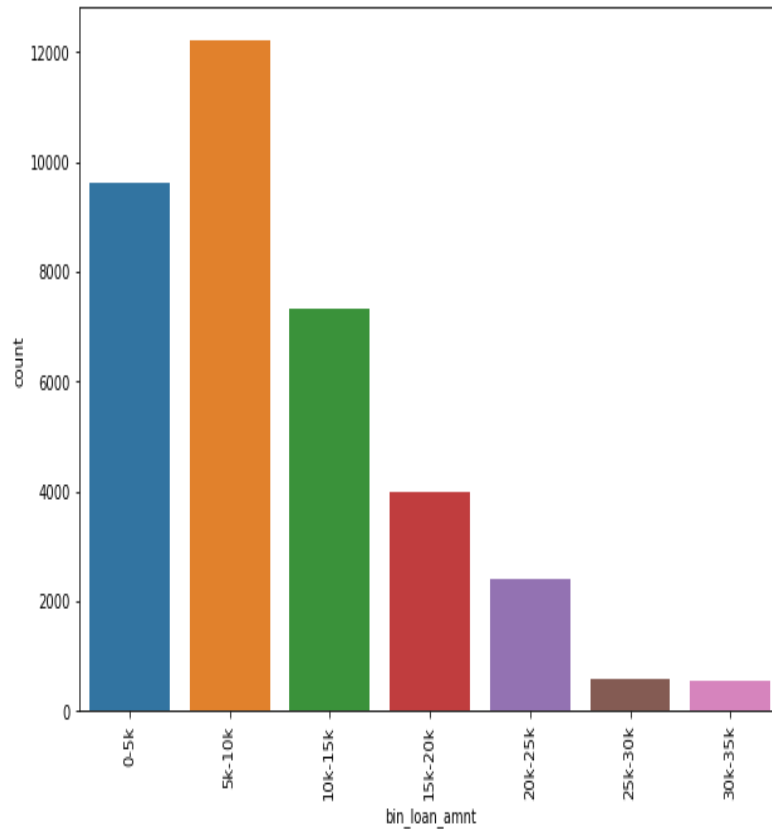


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- There are high Chances of loan defaulting when
  - Term is of 36 months
  - loan grade is 'B'
  - Home ownership status is "Rent"
  - Verification status is "Not verified"
  - For "debt consolidation" purpose
  - for applicant belonging to "CA" state
  - Loan issued in last month "december" of the year
  - For loan amount in the range of "5k-10k"
  - having annual income in between 2lac-3lac
  - having installment in between 100-200
  - DTI in range 10-15

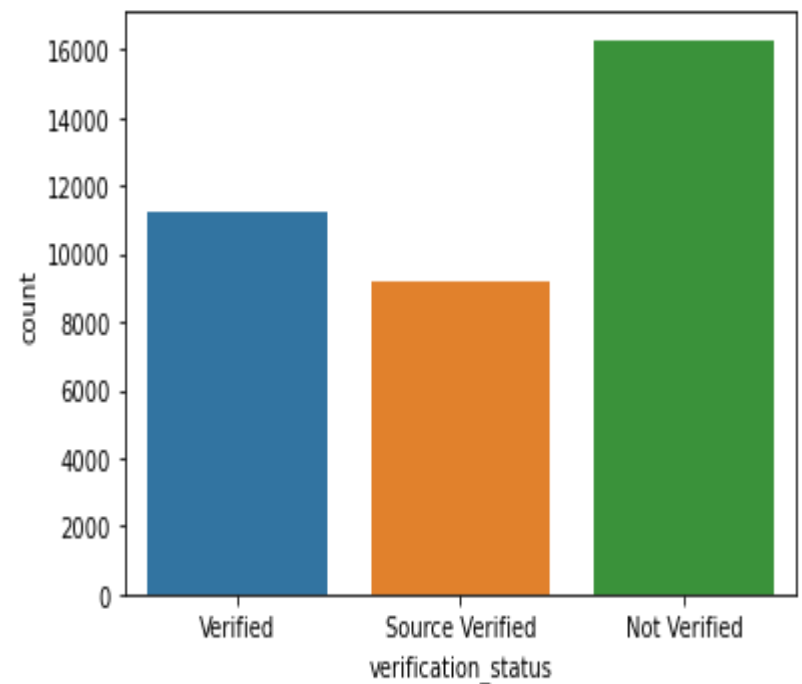
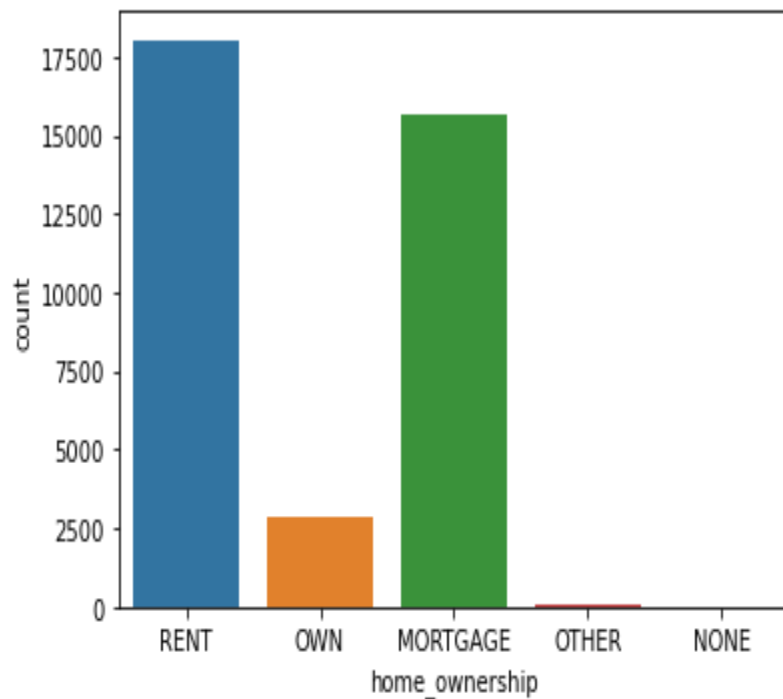
# Lending Club: EDA Case Study

## Univariate Analysis



# Lending Club: EDA Case Study

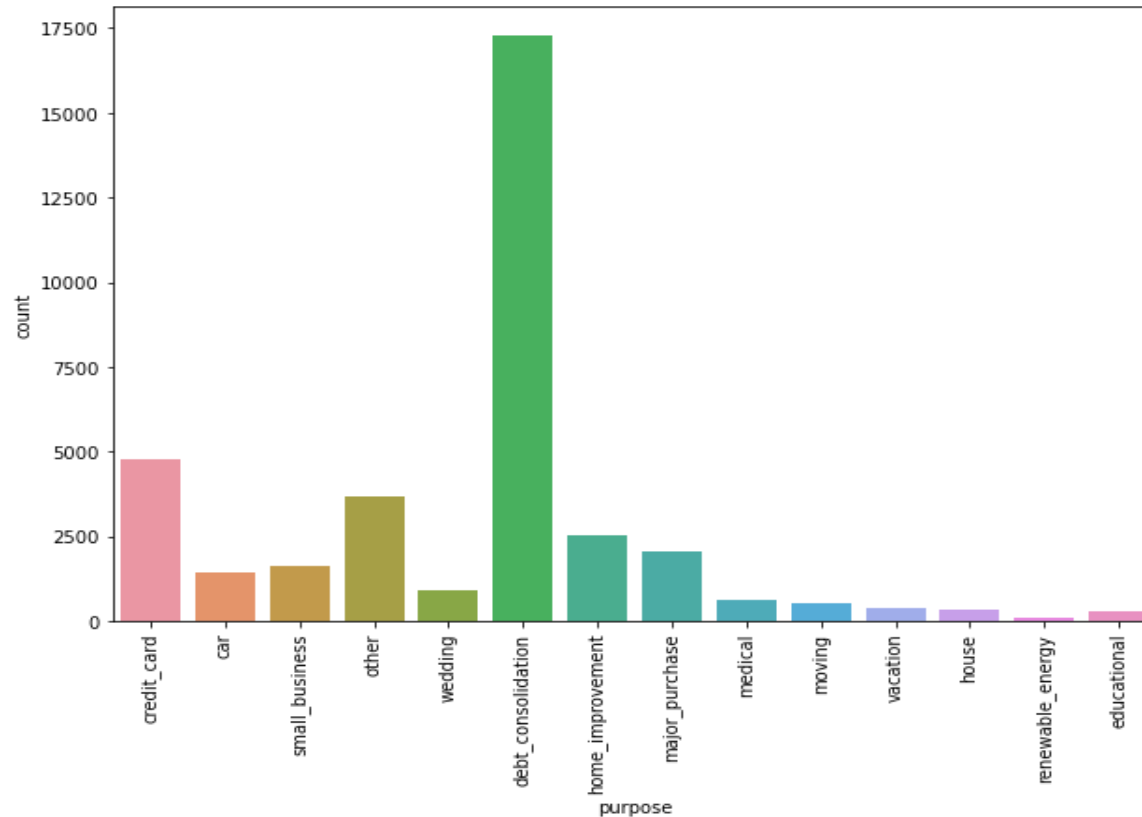
## Univariate Analysis





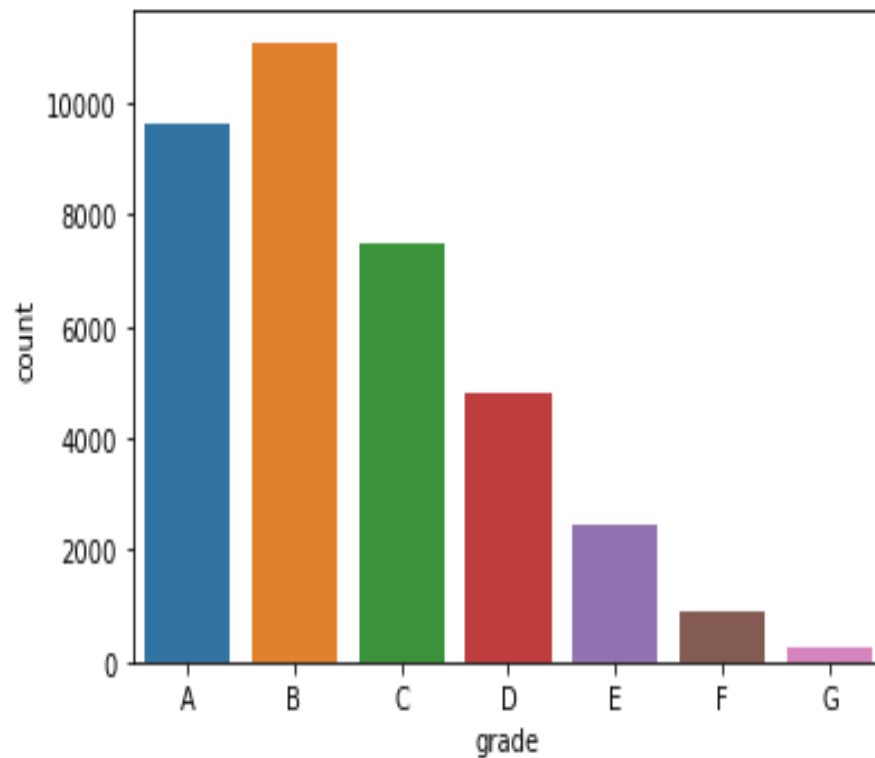
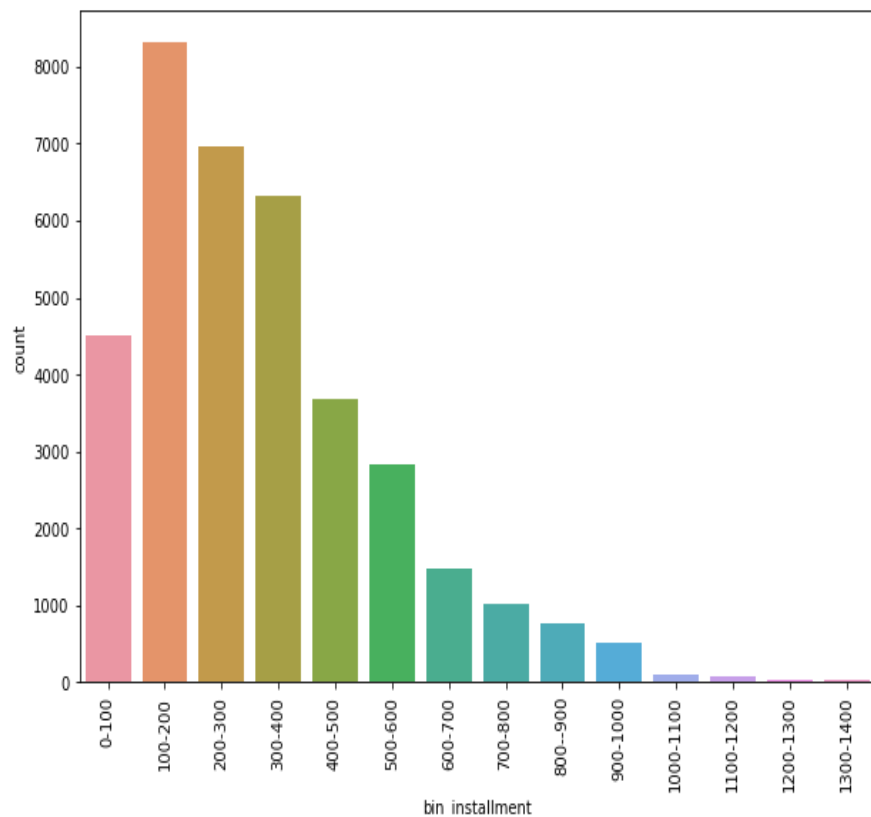
# Lending Club: EDA Case Study

## Univariate Analysis



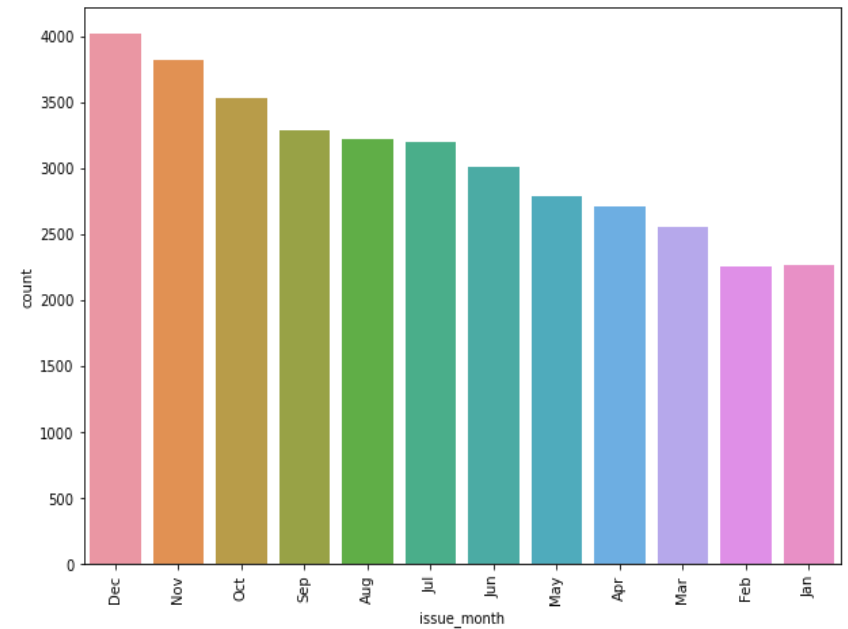
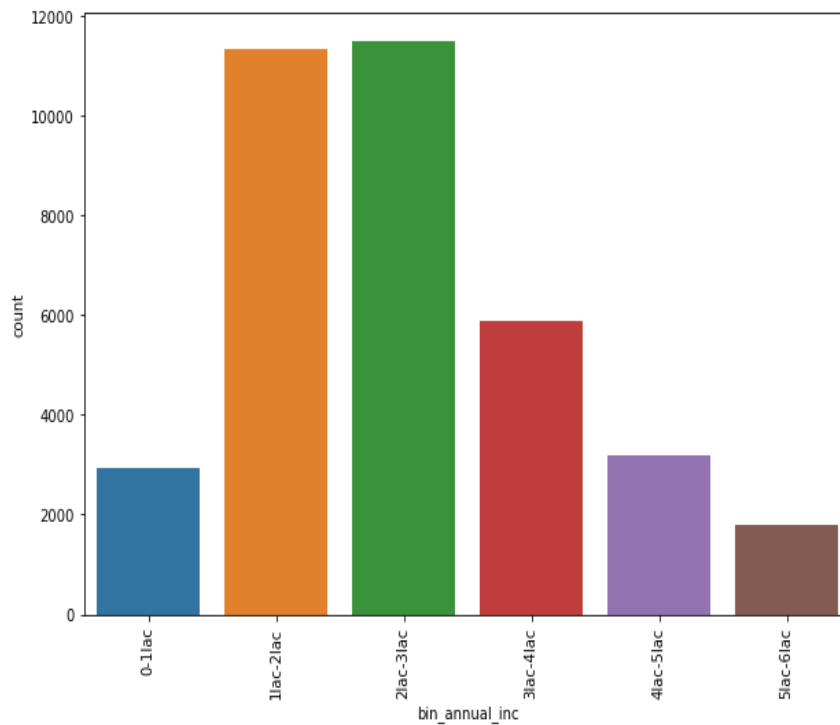
# Lending Club: EDA Case Study

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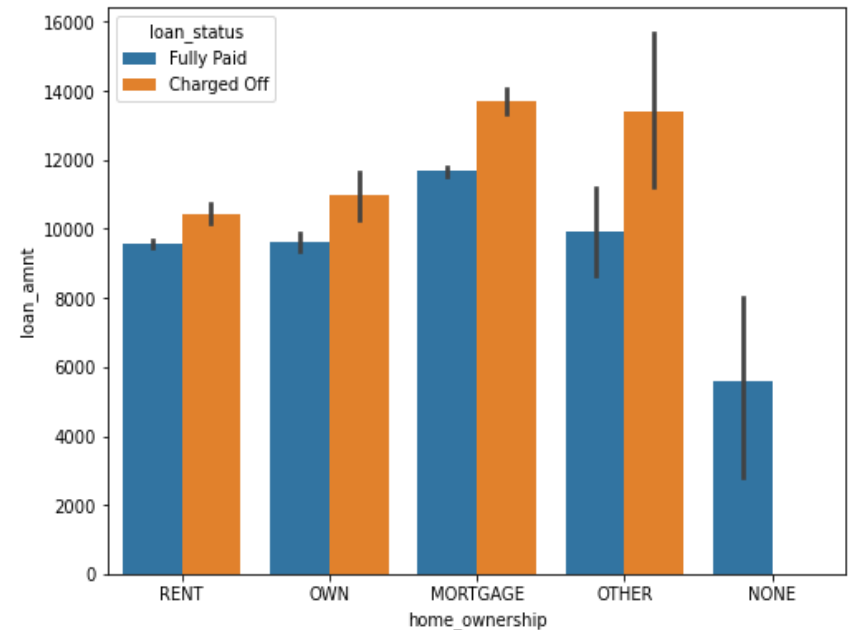
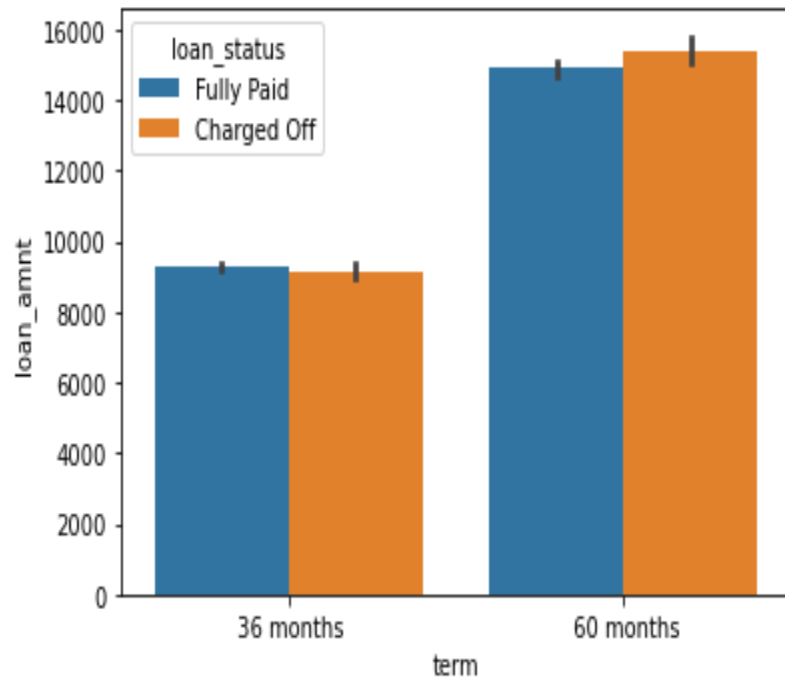
- **Data Visualization : Bivariate Analysis**

Below are the inference from the bi-variate analysis

- 1) Applicant who choose to have 60 month of term plan have higher loan amount.
- 2) Loan Amount increases with grade and so the chances of loan defaulting.
- 3) Applicant having home ownership as "Mortgage" applies for more loan and has high chances of defaulting.
- 4) Applicants having 10+ years of employment period and loan amount more than 12000, have high chances of loan defaulting.
- 5) Interest rate is higher for more 400-500 instalments, and it has high chances of loan defaulting.
- 6) People having annual income greater than 80000, gets high loan.
- 7) People in rage of 4-6 lac PA choose to have more instalments.
- 8) The people who takes the loan for purpose such as home improvement, medical, major purchase, renewable energy and education are generally not defaulters.

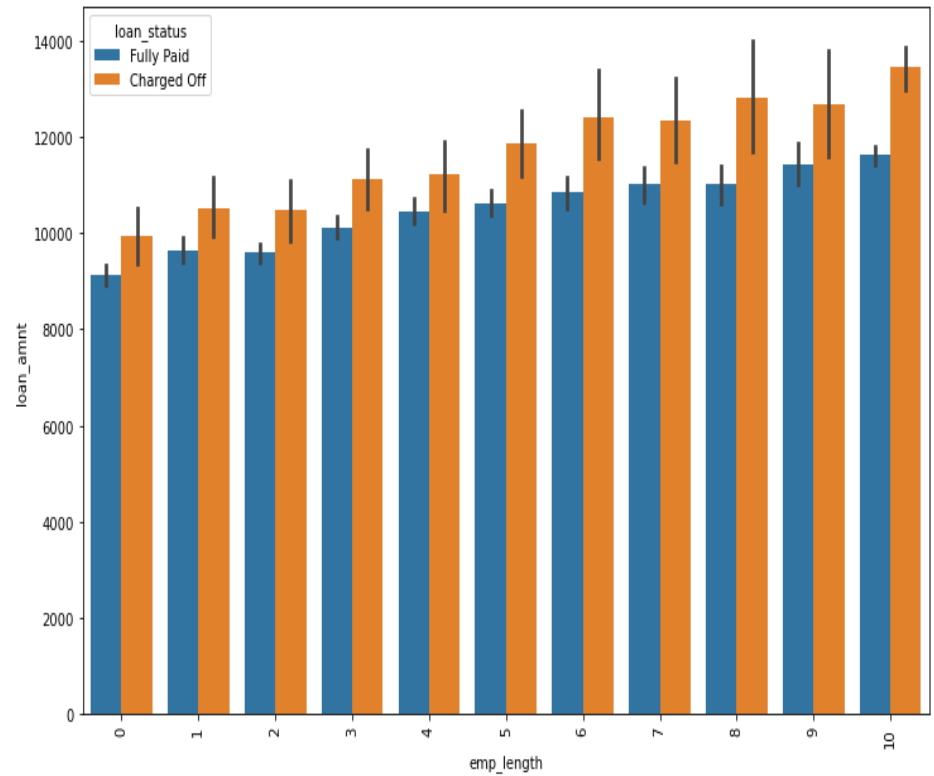
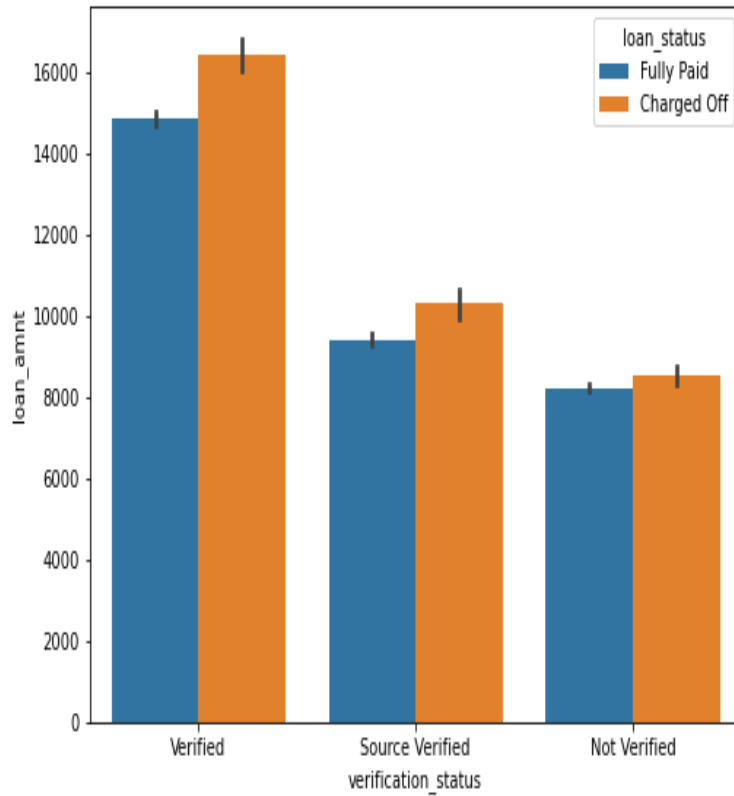
# Lending Club: EDA Case Study

## Bivariate Analysis



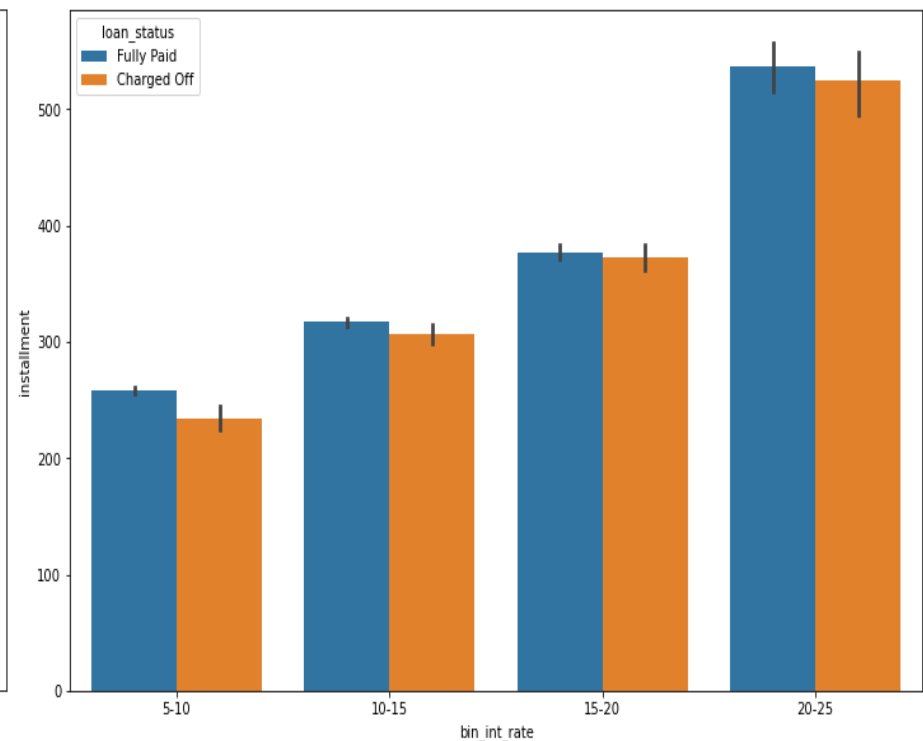
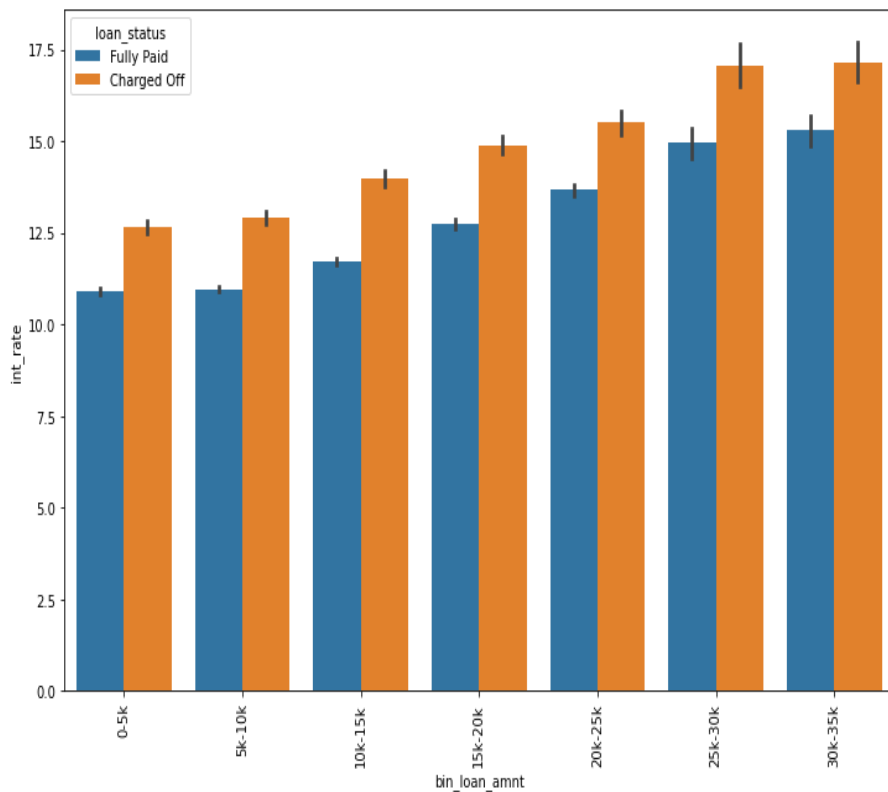
# Lending Club: EDA Case Study

## Bivariate Analysis



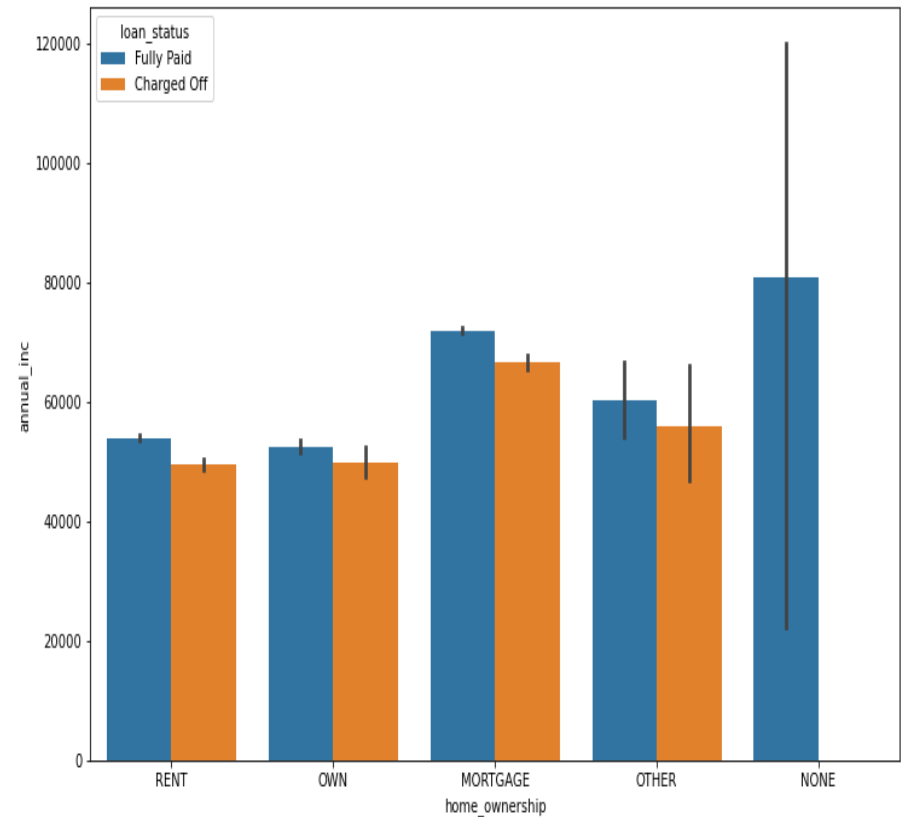
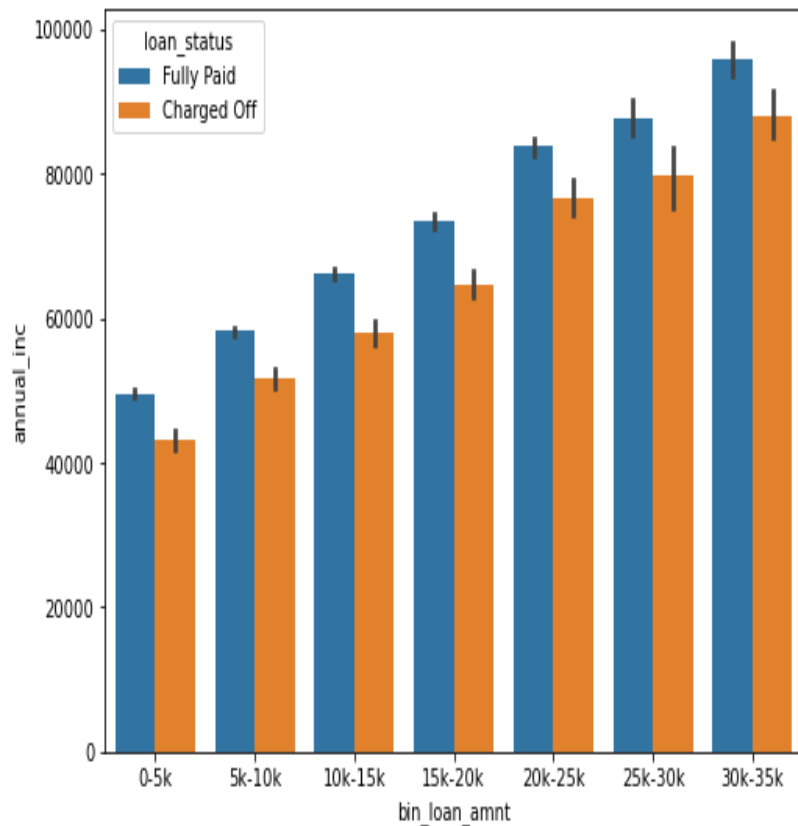
# Lending Club: EDA Case Study

## Bivariate Analysis



# Lending Club: EDA Case Study

## Bivariate Analysis





# Lending Club: EDA Case Study

- **Key fields :**

After referring to the data and perform the EDA below are the list of the driving variables which will help to define the loan defaulters

- loan\_amnt
- term
- int\_rate
- installment
- grade
- emp\_length
- home\_ownership
- annual\_inc
- verification\_status
- purpose

# Conclusions / Recommendations

- Annual income is a very strong attribute for taking the loan and the loan amount is higher for higher annual income.
- If the loan tenure is more, the chances to become the defaults is less.
- Higher the grade, lesser is the chance to become defaulters.
- The riskiest purpose for the defaulters are credit card, small business, vacation and debt consolidation.
- Verified customer have less chances to become the defaulters.
- Application who are verified have high loan amount with greater tenure.
- With higher grade, interest rate is higher - People with higher salary tend to take more loan amount as compared to people having less salary.
- Loan should be provided to the application who has greater employment tenure.
- Loan should be provided to the people who own's the house.

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Thank You!