



Lending Club Case Study

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AIML BATCH : C37

Data Analysis :

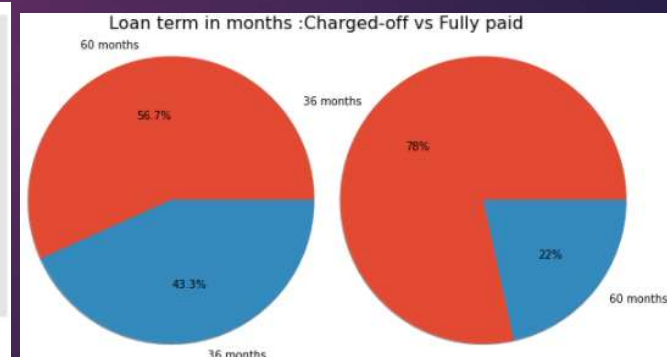
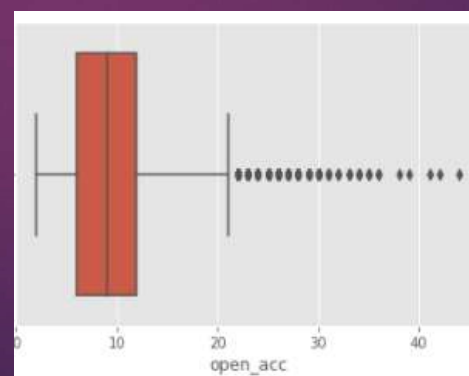
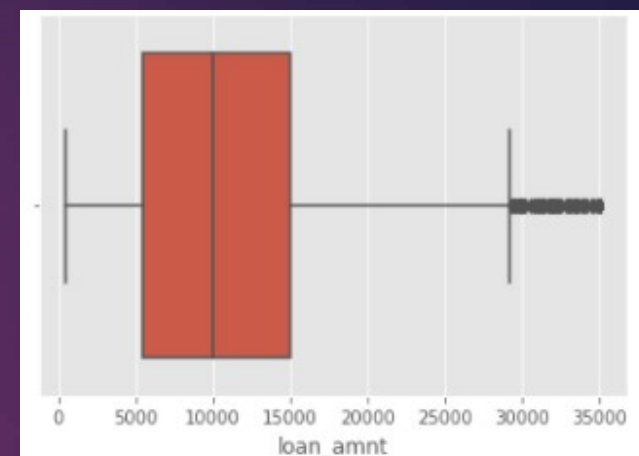
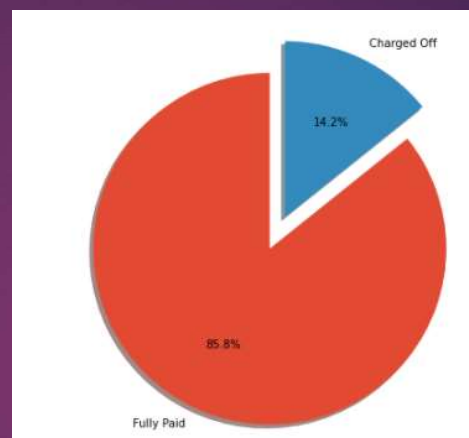
- ▶ **Problem statement** : Lending club is a finance company which offers loans to applicants. In order to make profitable business, they need to reduce the number of default or charged-off loans. **Charged-off** loans are those loans where the applicant has not paid the instalments in due time for a long period of time, i.e. he/she has defaulted on the loan.
- ▶ **Analysis Approach** : The data is systematically analyzed in with different methods and conclusions are drawn from the analysis. The steps include :
 1. **Data Cleaning**
 2. **Derived data**
 3. **Univariate Analysis on :**
 - A. **Categorical data**
 - B. **Numeric data**
 4. **Bivariate Analysis on :**
 1. **Two numeric data**
 2. **Two categorical data**
 3. **Two categorical with one numeric data**
 5. **Multivariate Analysis**

Data Cleaning

- ▶ Remove current loan status records and keep only fully paid and Charged-off loan status records
- ▶ Drop not needed columns
- ▶ Drop similar value columns
- ▶ Check for null values
- ▶ Imputation of data :
 - ▶ Missing value replacement
 - ▶ Dropping invalid records
- ▶ Remove symbols like %
- ▶ Split time into day/month/year

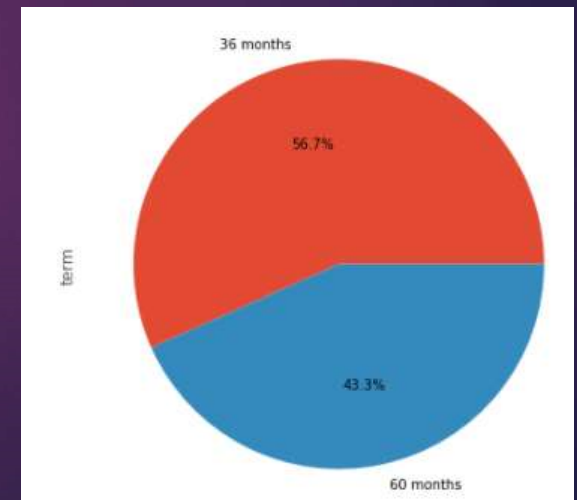
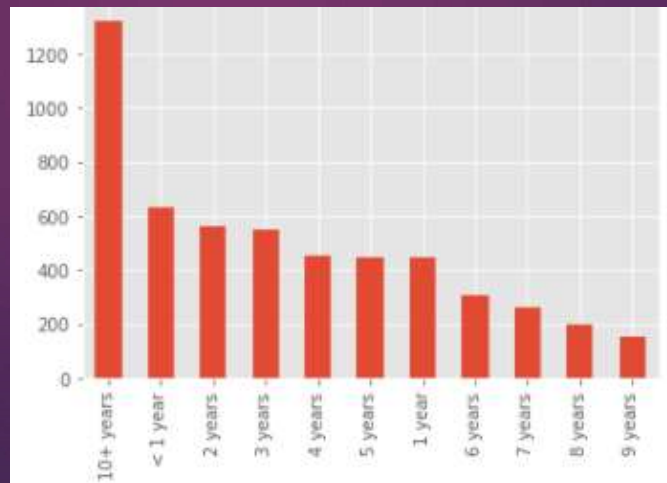
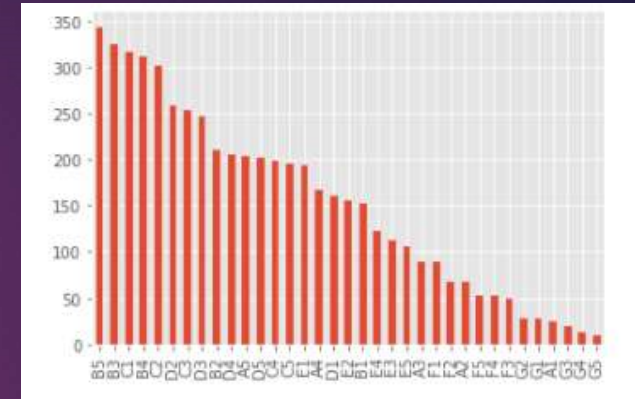
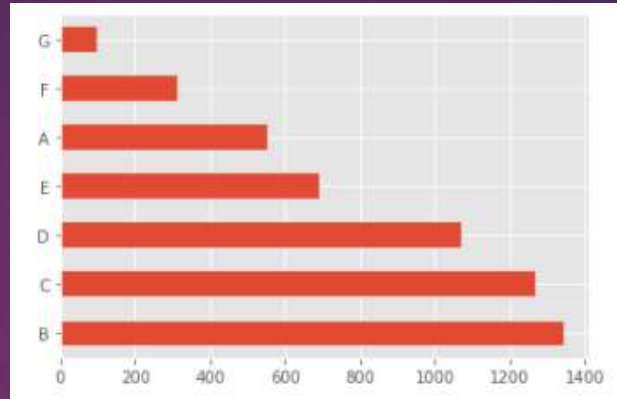
Univariate Data Analysis

- ▶ Charged off records make 14.2% of total loan records
- ▶ Loan amount is in range of 5-15K, Outliers in loan amount are $\geq 30K$
- ▶ On average, accounts hold active credit records between 7-12
- ▶ Majority of charged-off accounts are with longer loan term of 60 months (56.7%) . In fully paid accounts there are lesser number of long term loans.



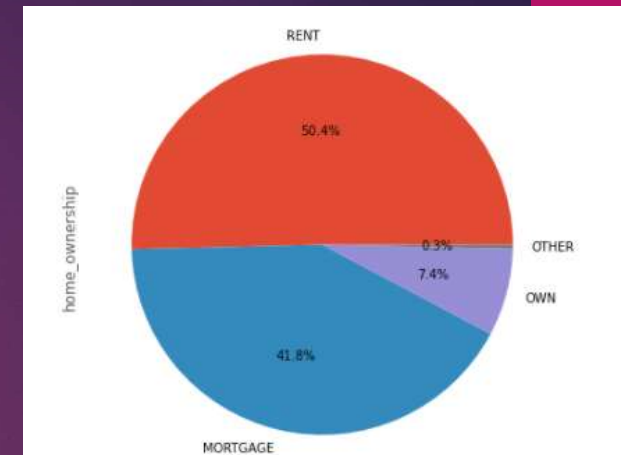
Univariate Data Analysis

- ▶ Majority of charged off accounts are in grade B
- ▶ Majority of charged off accounts are in sub grade B5
- ▶ Majority defaults are 10+ yrs , 2nd highest <1 yr
- ▶ Majority of charged-off accounts are for 36 months (3yrs)



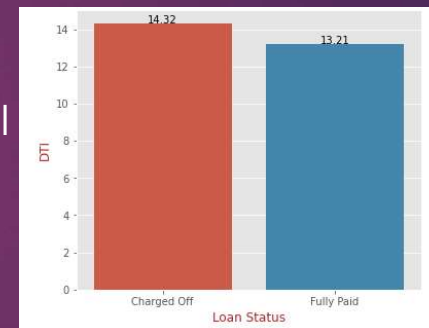
Univariate Data Analysis

- ▶ Majority of charged off accounts have home ownership as Rent (50.4%)
- ▶ Majority of charged-off accounts are not verified



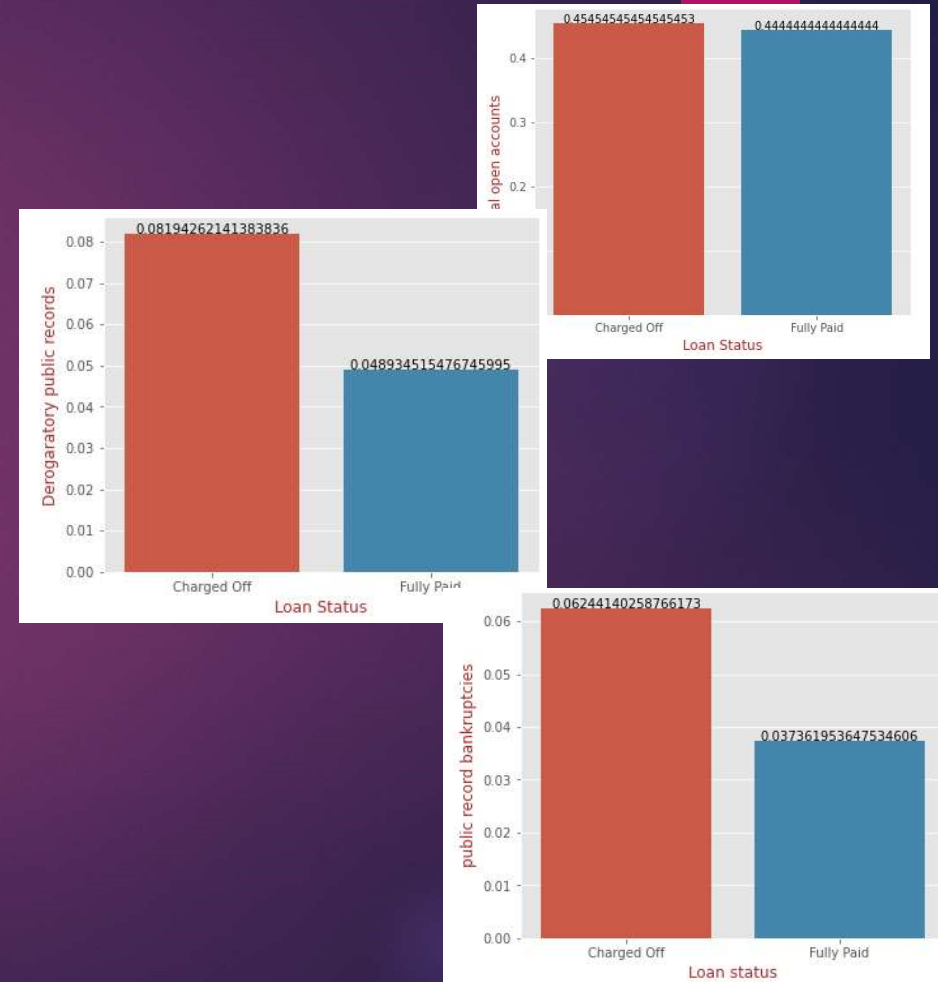
Loan status vs important data

- ▶ **loan status vs Loan amount** : 15.7 % of total amount is charged off. These are the problematic accounts which needs to be analysed to ensure newer sactioned loans will reduce the % of charged off amount
- ▶ **loan status vs dti** : The average (median) of DTI for Charged off loans is 14.32 which is higher compared to Fully paid loans
- ▶ **loan status vs inq last 6mths** : The number of inquiries in past 6 months (excluding auto and mortgage inquiries) . Average number of enquiries done by charged off records is more than fully paid records



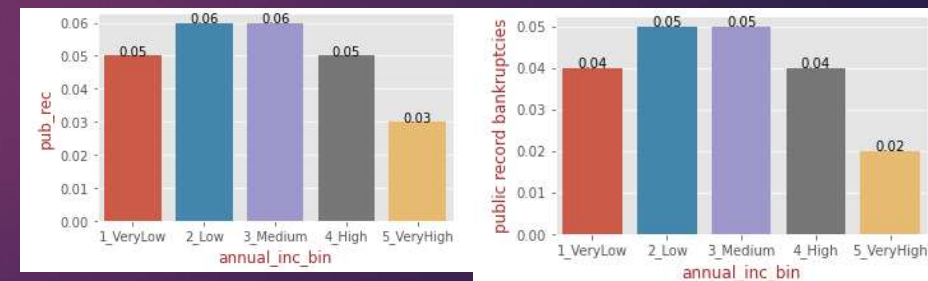
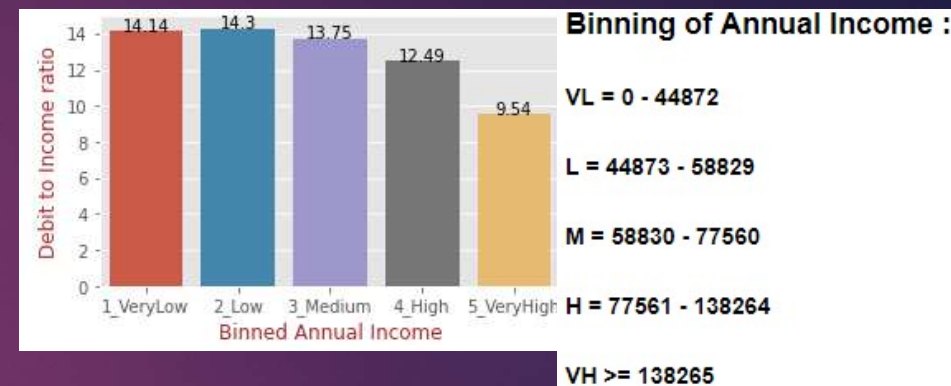
Loan status vs important data

- ▶ **loan status vs open acc** : Ratio of open_acc to total_acc is more in charged off records compared to Fully paid records, but the difference is not very big, cant be a differentiating factor
- ▶ **loan status vs pub rec** : Average number of derogatory public records are higher in Charged off records compared to fully paid records
- ▶ **loan status vs pub rec bankruptcies** : Average number of public record bankruptcies is higher in Charged of records



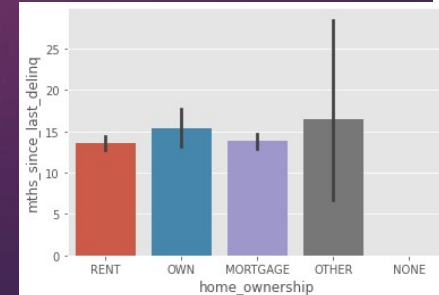
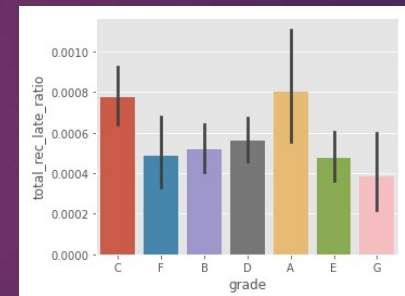
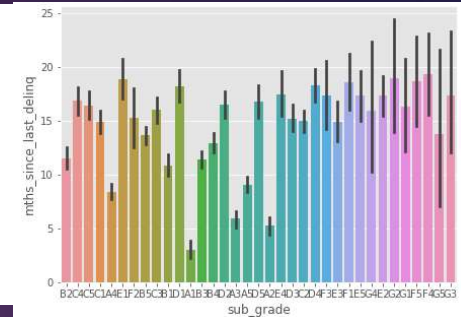
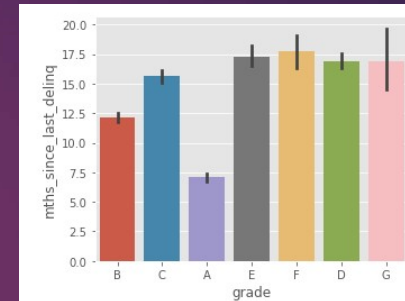
Binned Annual income vs important data

- ▶ **Binned annual Income vs dti:** Low annual income group have more dti , hence they are more likely to faulty
- ▶ **Binned Annual Income bin vs pub rec:** Low and medium annual income group has many public records
- ▶ **Binned Annual Income bin vs pub rec bankruptcies:** Low and medium annual income group has many number of public record bankruptcies



Grade , Home ownership vs important data

- ▶ **Grade vs number of months since the borrower's last delinquency**: Grade A shows more frequent delinquency(error) and in Grade A, more delinquency is in lower sub-grades
- ▶ **Grade vs total rec late fee** : By looking at the ratio of late fees received vs total fees received in the charged-off dataset, Group A has more number of late fees paid
- ▶ **home ownership vs loan amnt** : Mortgage home ownerships take more loan
- ▶ **home ownership vs mths since last delinq** : Mortgage has lower mths_since_last_delinq , ie, more frequent defaults have occurred in Mortgage home ownerships



verification status vs important data

- ▶ **verification status vs pub rec:** Not verified records have many public records
- ▶ **Purpose vs loan amount:** small businesses higher reason for loan taking pupose

