



Lending Club Case Study

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Abstract

- Consumer finance company which specializes in lending various types of loans to urban customers.
- Lending loan to risky customers could lead to financial loss
- Borrowers can easily access lower interest rate loans through a fast online interface.
- The objective of this study to perform risk analysis based on past loan data provided to different customers





Problem solving methodology

Data Data Analysis Analysis Analysis

Data Cleaning

Removing the null valued columns, unnecessary variables and checking the null value percentage and removing the respective rows.

Data **Understanding**

Working with the Data Dictionary and getting knowledge of all the columns and their domain specific uses

Univariate Analysis

Analysing each column, plotting the distributions of each column.

Segmented Univariate Analysis

Analysing the continuous data columns with respect to the categorical column

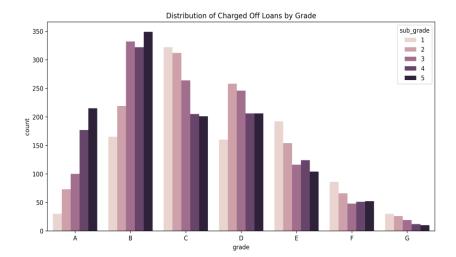
Bivariate Analysis

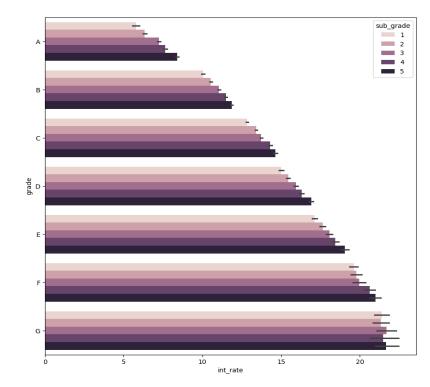
Analysing the two variable behaviour like term and loan status with respect to loan amount.

Recommendations

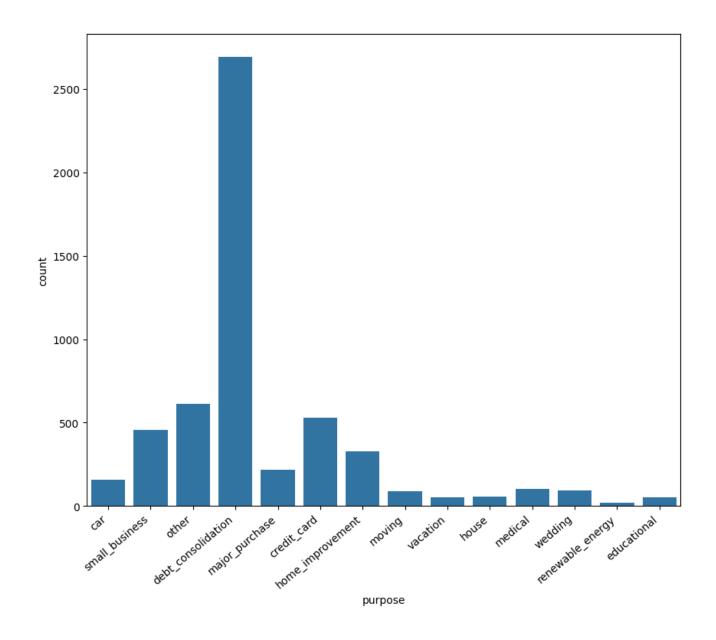
Analysing all plots and recommendations for reducing the loss of business by detecting columns best which contribute to loan defaulters.

- Grades have the potential to identify risky and non-risky borrowers
- In-general People in the 'B' grade (especially 'B5') tend to have the higher change of defaulting
- But, when the lower graded get loans with higher interest rate they tend to default more than the higher grades
- Univariate analysis for loans status against grade shows that grade 'B' has the most cases of "Charged-Off" loan status

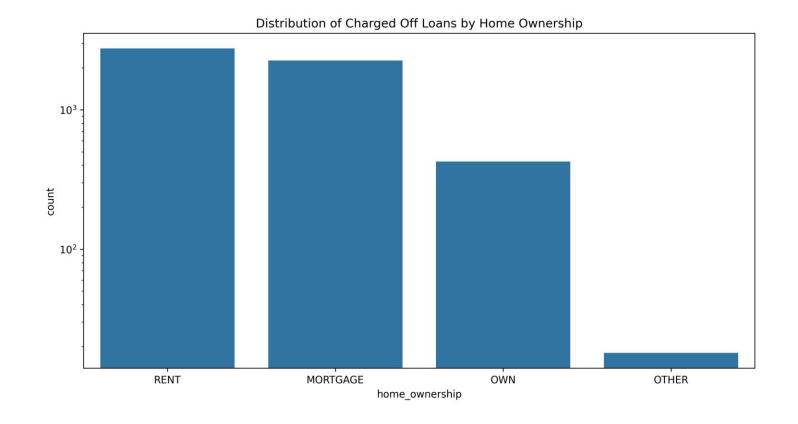




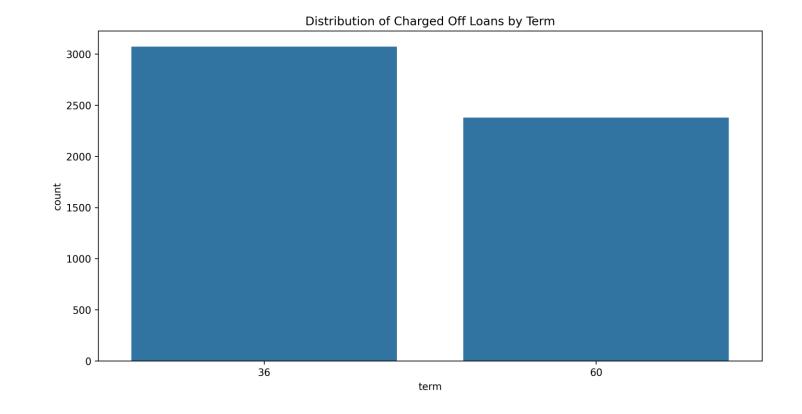
 Borrower's whose purpose is 'debt-consolidation ' has the most number of loan charge-off



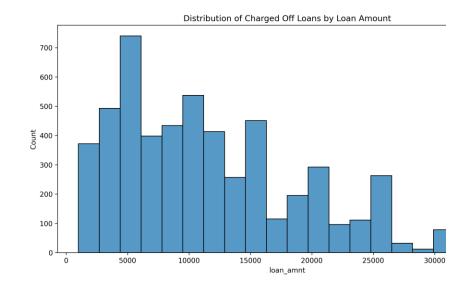
- Borrowers tend to default the loan when the 'home ownership' is 'Rent'
- This thus increases their chances of becoming defaulters

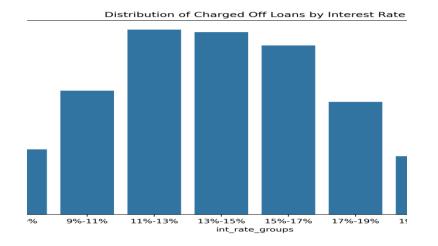


- Borrowers tend to choose for lesser term for lesser interest payments
- The analysis shows that on less term the borrowers defaults the payment the most

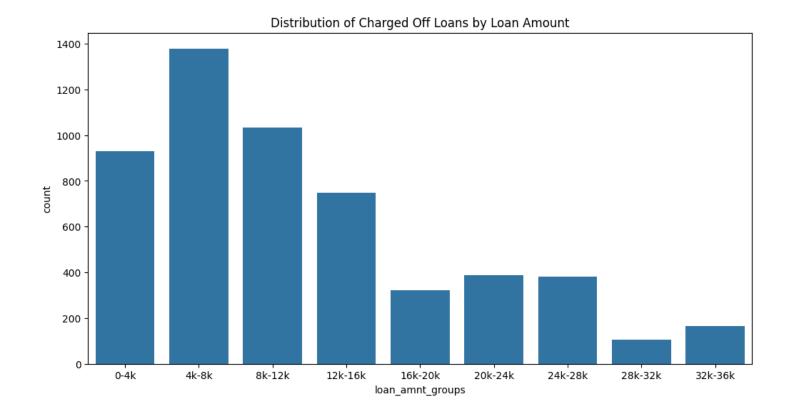


- People who took high loan amount with high interest rate in it and they faced difficulties in returning the sum to bank.
- Here as per the analysis we can see that higher the loan amount more chances of defaulting
- With higher sum the rate of interest also increases due to term opted. Most people opt for 60 days term which increases the rate of interest
- When the interest is 11%-14% the default rate is high

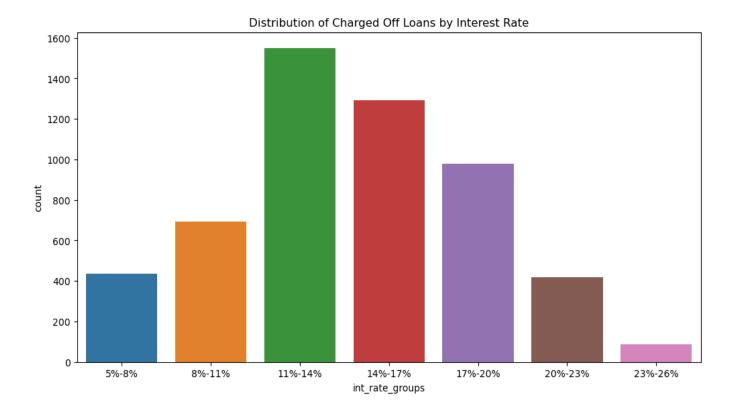




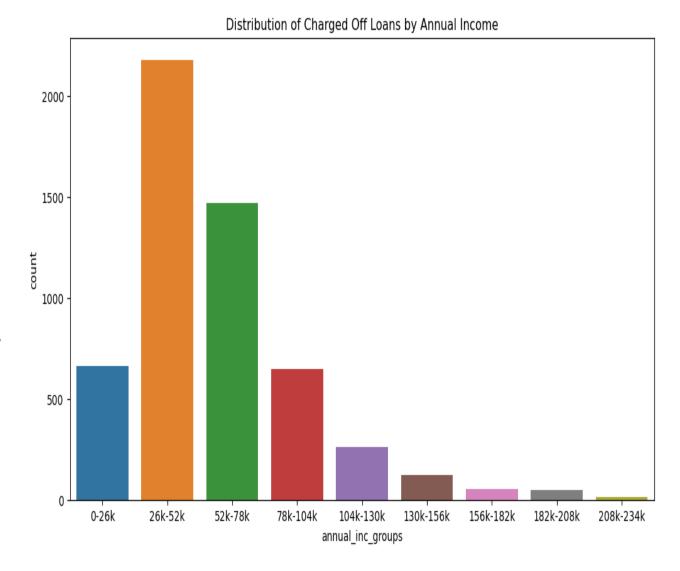
 People who took loan amount within 4k-8k had more defaults than others



• The figure shows that people who has taken the loan at the interest rate in the range of 11%-14% have the higher chances of defaulting



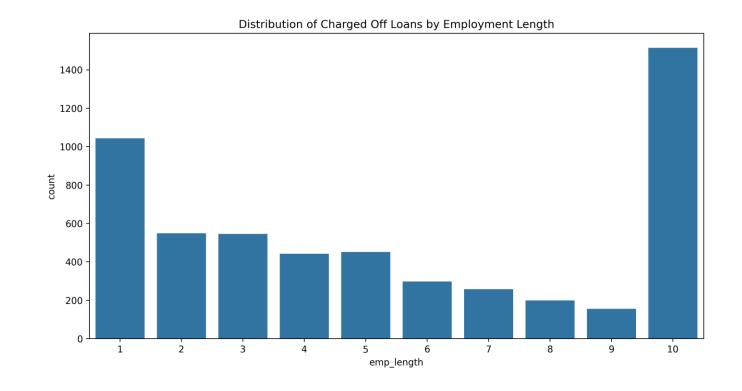
- Other factors that also plays role in analyzing defaulters rate is annual income
- An employee whose annual income is 26K-52k has the most charge-offs



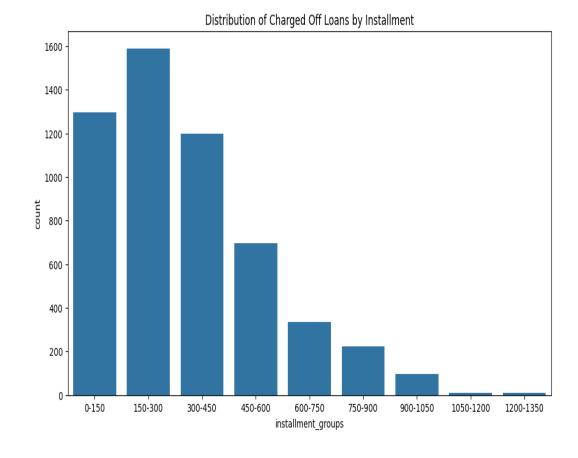




- Other factors that also plays role in analyzing defaulters rate is employment length.
- As per the analysis an employee whose tenure is more the 10 years tend to default the most



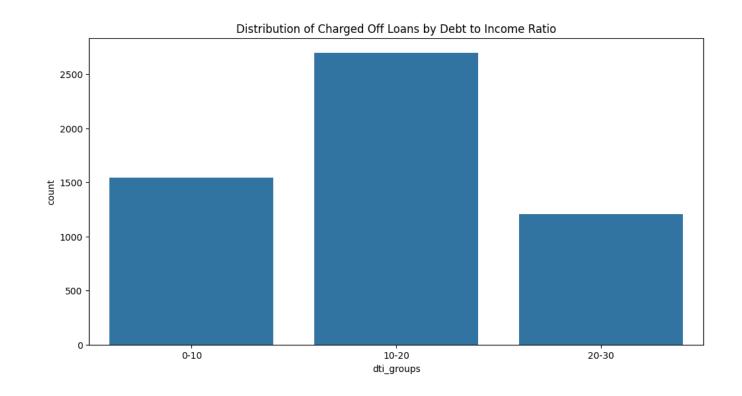
- Other factors that also plays role in analyzing defaulters rate is installment one chooses.
- The installment chosen between 150-300 has more default chances







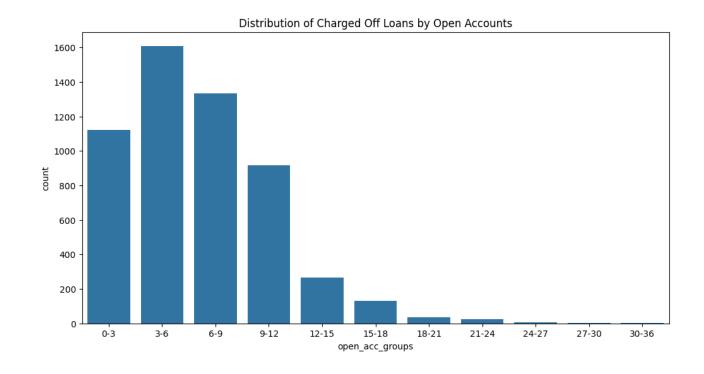
- Other factors that also plays role in analyzing defaulters rate is debt-to-income ratio
- The defaulter are high when the ratio range is 10-20



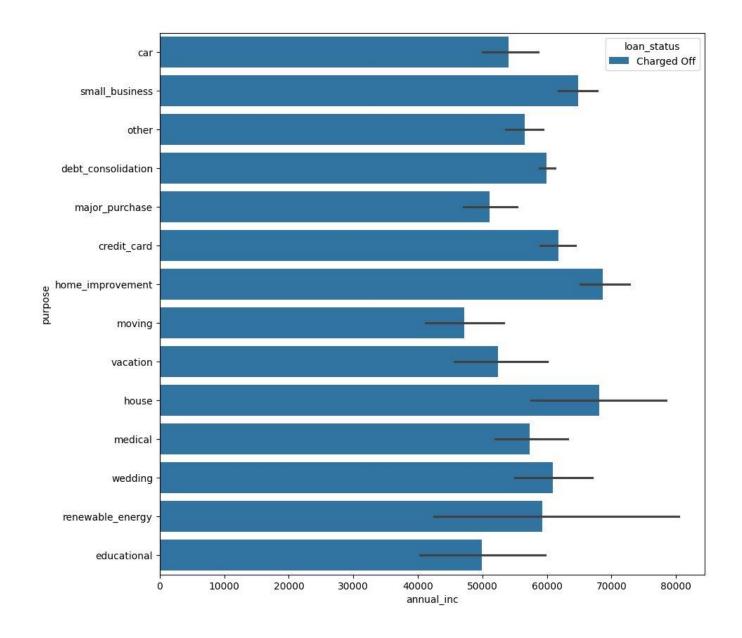




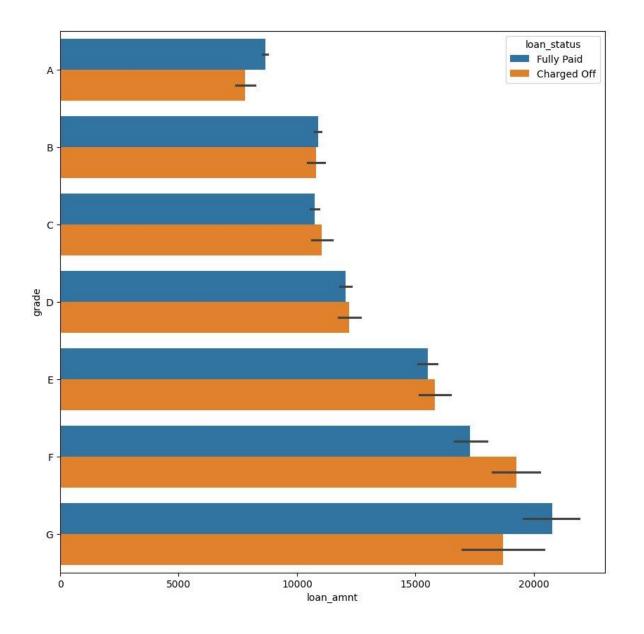
- Other factors that also plays role in analyzing defaulters rate is open_acc
- The defaulter are high when open_acc range is 3-6



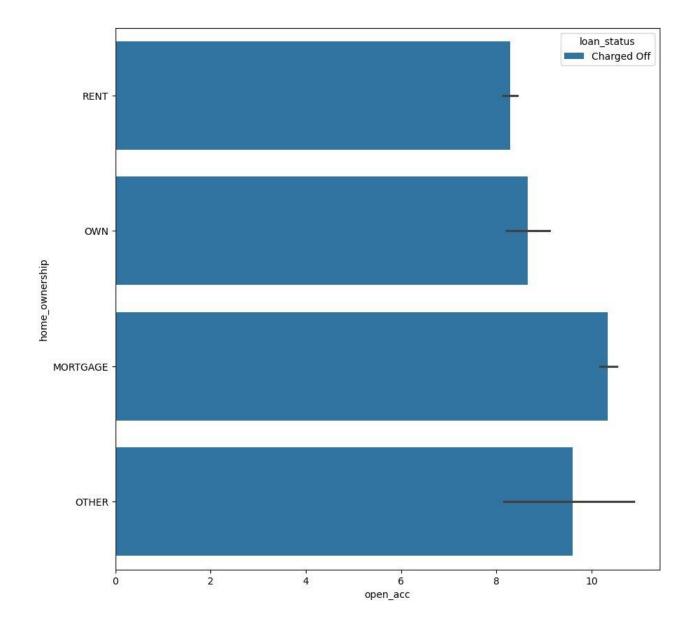
 When the annual income is between '60k-70k' and the purpose is home_improvement or house then the borrower has the high chance of charging off



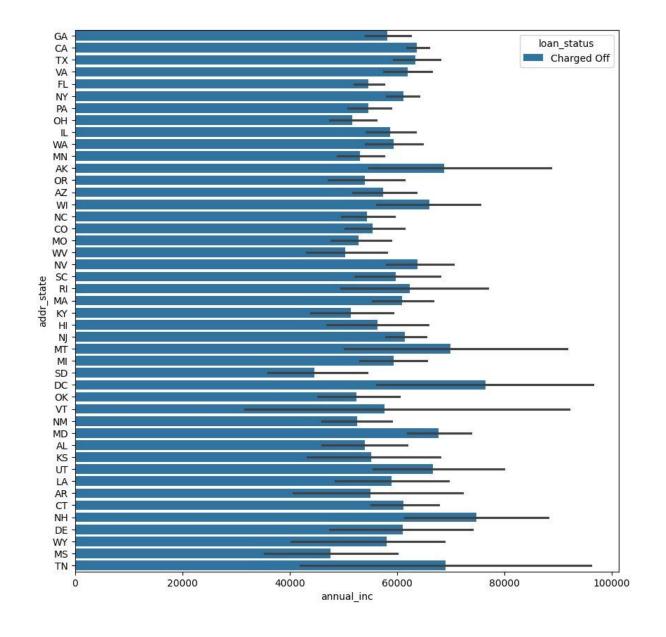
- Lower the grade (E,F,G)higher is the risk of charge off
- The grade (E,F,G) takes loan of higher amount which could be a reason of more defaults



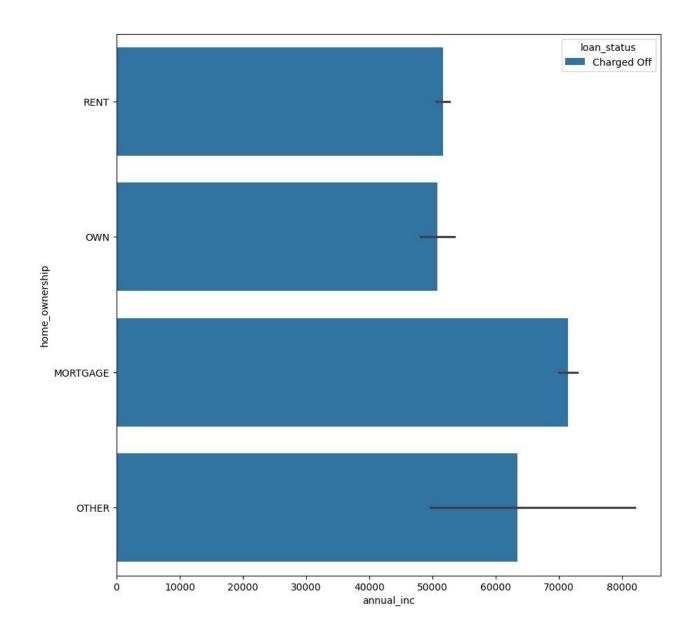
- •Using Bivariate analysis we can conclude that borrowers on 'mortgage' have the high risk of charging off
- •This is due to higher open credit line due to which they have more loans



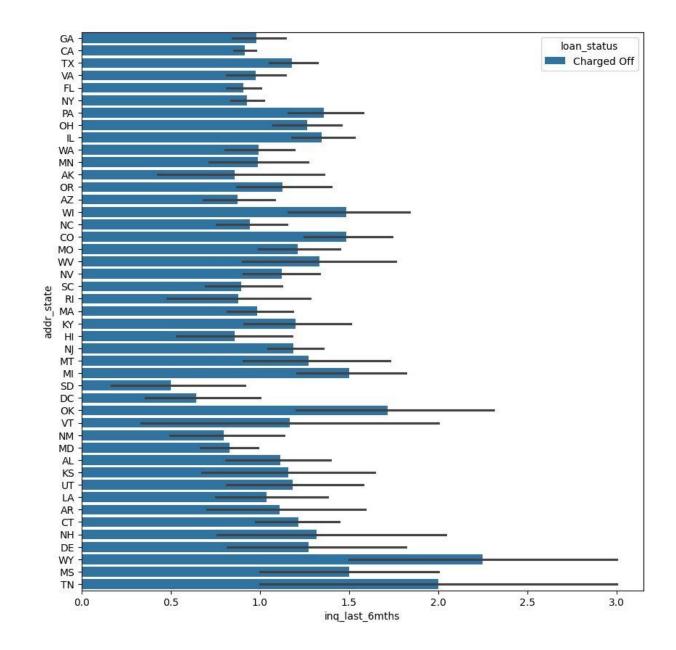
 When the addr_state is 'DC' and annual_inc is between 70k-80k have the high default count



• Borrowers having higher annual income and home ownership as mortgage has high chance of charge-off



 When the addr_state is 'WY' and inq_last_6mths is above 2 have the most charge off







Conclusion (Uni-Variate Analysis)

From the univariate analysis, we can make the following observations that there is more possibility of defaulting when:

- ❖ When the 'grades' is 'B'
- ❖ When the 'sub_grade' is 'B5'
- ❖ When the purpose is 'debt_consolidation'
- ❖ When the 'home_ownership' is 'RENT'
- ❖ When the 'term' is '36 months'
- ❖ When the 'revol util' is between '60-80'
- ❖ When the 'loan_amnt' is between '4k-8k'
- ❖ When the 'int rate' is between '11%-14%'
- ❖ When the 'installment' is between '150-300'
- ❖ When the 'emp_length' is between '10+ years'
- ❖ When the 'annual_inc' is between '26k-52k'
- ❖ When the 'dti' is between '10-20'
- ❖ When the 'open_acc' is between '3-6'
- ❖ When the 'addr_state' is 'CA'





Conclusion (Bi-Variate Analysis)

From the bi-variate analysis, we can make the following observations that there is more possibility of defaulting when:

- ❖ When the 'annual_inc' is between '60k-70k' purpose is 'home_improvement' or 'house'
- ❖ When the 'annual_inc' is between '60k-70k' and 'grade' is 'F' or 'G'
- ❖ When the 'annual_inc' is between '60k-70k' and 'home_ownership' is 'MORTGAGE'
- ❖ When the 'annual inc' is above '60k' and 'revol util' is between '80-100'
- ❖ When the 'purpose' is 'small business' and 'loan amnt' is '14k-16k'
- ❖ When the 'purpose' is 'credit_card' and 'dti' is between '14-16'
- ❖ When the 'purpose' is 'vacation' and 'emp_length' is between '6-7 years'
- ❖ When the 'purpose' is 'house' and 'inq_last_6mths' is between '1-2'
- ❖ When the 'home_ownership' is 'MORTGAGE' and 'open_acc' is close to '10'
- ❖ When the 'loan_amnt' is between '15k-20k' and 'grade' is 'F'
- ❖ When the 'addr_state' is 'WY' and 'loan_amnt' is above '15k'
- ❖ When the 'addr state' is 'DC' and 'annual inc' is between '70-80k'
- When the 'addr_state' is 'WY' and 'inq_last_6mths' is above '2'