### Lenden Club Case Study

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### Business Understanding

Lenden Club is a consumer finance company that specialises in lending various types of loans to urban customers. When the company receives a loan application, the company has to make a decision for loan approval based on the applicant's profile. Two types of risks are associated with the bank's decision:

- If the applicant is likely to repay the loan, then not approving the loan results in a loss of business to the company
- If the applicant is not likely to repay the loan, i.e. he/she is likely to default, then approving the loan may lead to a financial loss for the company

When a person applies for a loan, there are two types of decisions that could be taken by the company:

- 1. Loan accepted: If the company approves the loan, there are 3 possible scenarios described below:
  - 1. Fully paid: Applicant has fully paid the loan (the principal and the interest rate)
  - 2. Current: Applicant is in the process of paying the instalments, i.e. the tenure of the loan is not yet completed. These candidates are not labelled as 'defaulted'.
  - 3. Charged-off: Applicant has not paid the instalments in due time for a long period of time, i.e. he/she has defaulted on the loan
- 2. Loan rejected: The company had rejected the loan (because the candidate does not meet their requirements etc.). Since the loan was rejected, there is no transactional history of those applicants with the company and so this data is not available with the company (and thus in this dataset)

### Approach



Understand the data provided using the data dictionary



Filter unnecessary data



Remove unwanted data using multiple approaches – less availability, outlier treatment, high correlation



Impute the data wherever required



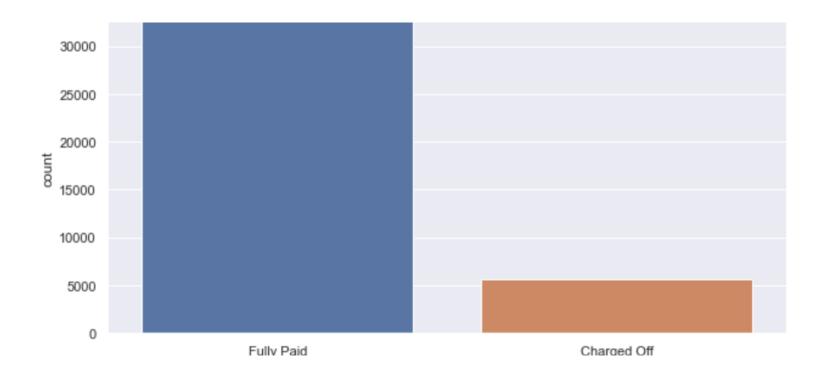
Create bins for numerical columns to convert them



Conducted univariate analysis & bivariate analysis

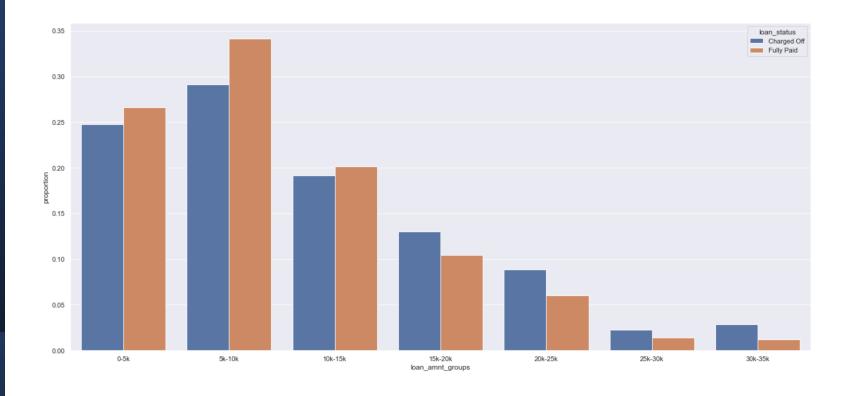
85% of the customers have paid the loan and 15% have defaulted

#### Loan status



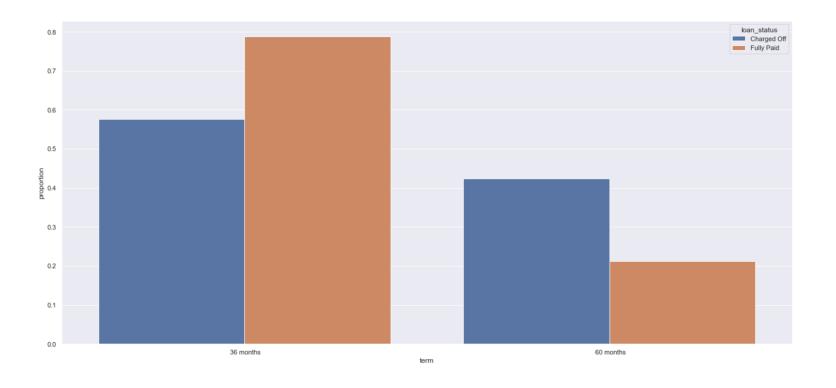
With increase in loan amount the default rate is also increasing

# Loan amount groups



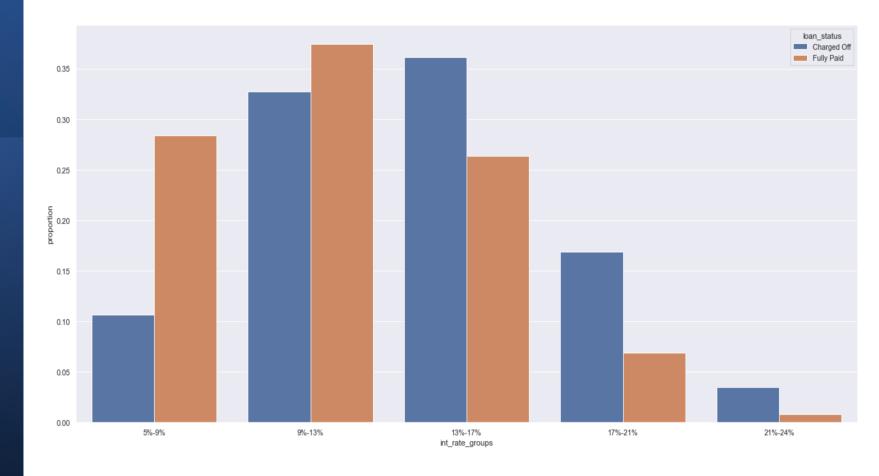
Loans with higher term is more like to be defaulted

#### Term



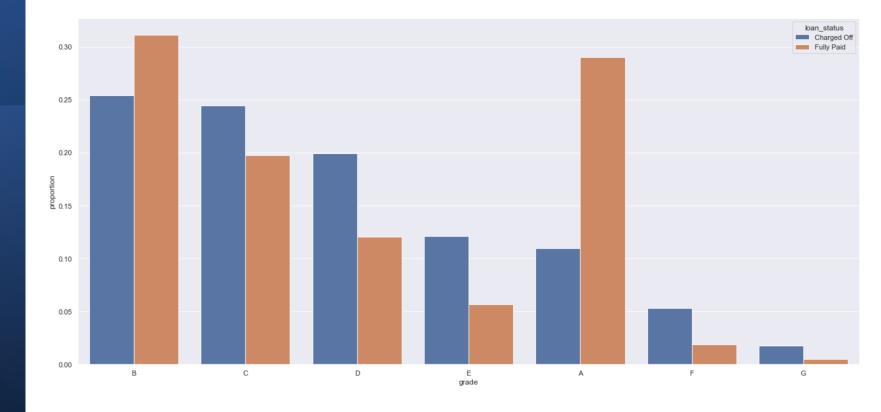
The higher the interest rate the more the default rate

## Interest rate groups



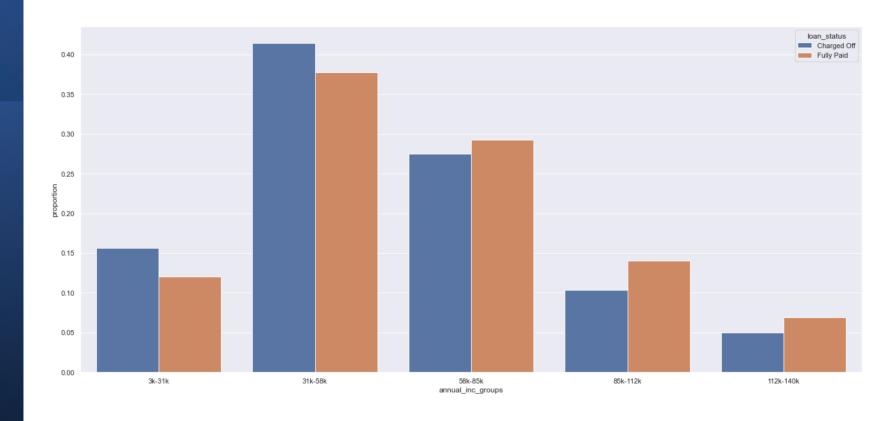
With loan grade the default rate is increasing – A with lowest default rate to G with highest default rate

#### Grade



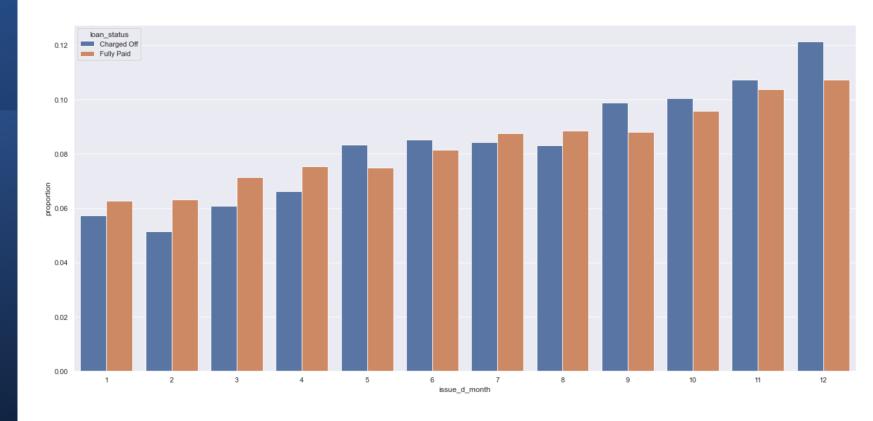
With increase in annual income the default rate is reducing

### Annual income



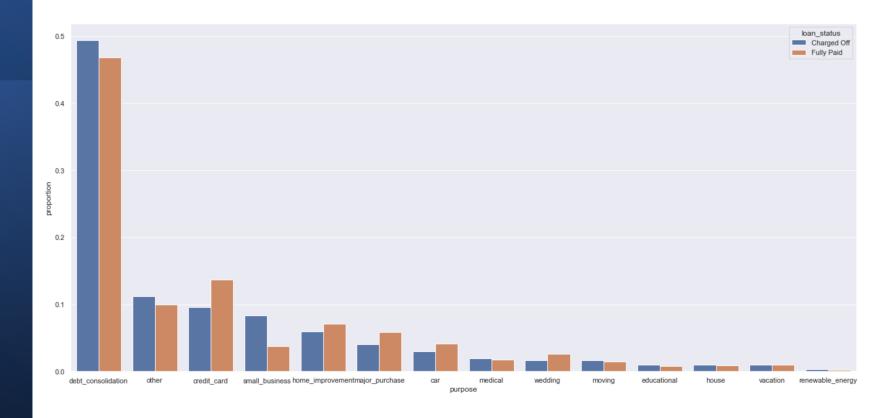
Loans issued is increasing with each month. The proportion of default ratio is also to an extent.

#### Issue month



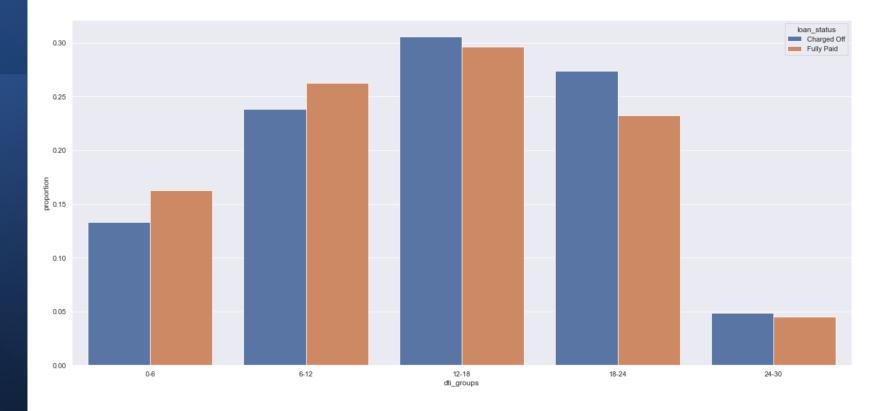
Clearly shows that loans taken for debt consolidation, other & small business has a higher chance to default. However, loans taken for credit card, home improvement, car and wedding has lower chance to default

#### Purpose



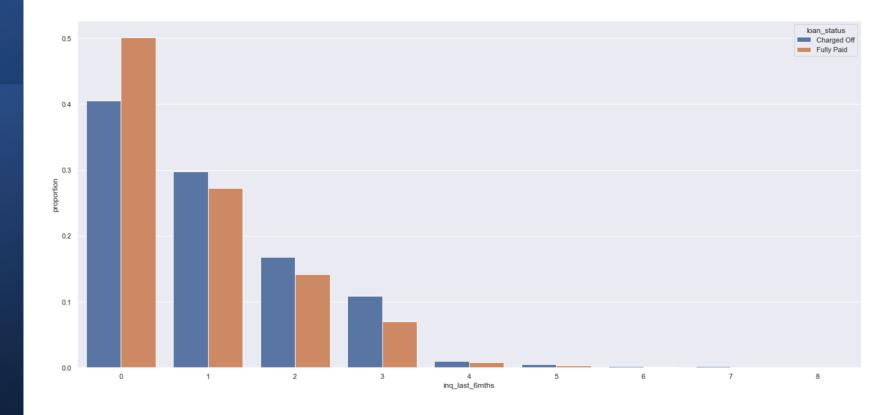
With increase in DTI the default proportion is increasing

DTI



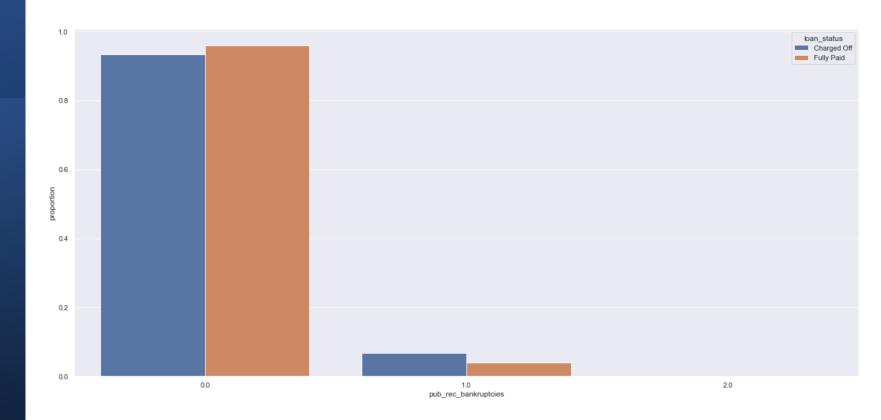
Customers with no enquiries have lower default ratio

# Inquiry in last 6 months



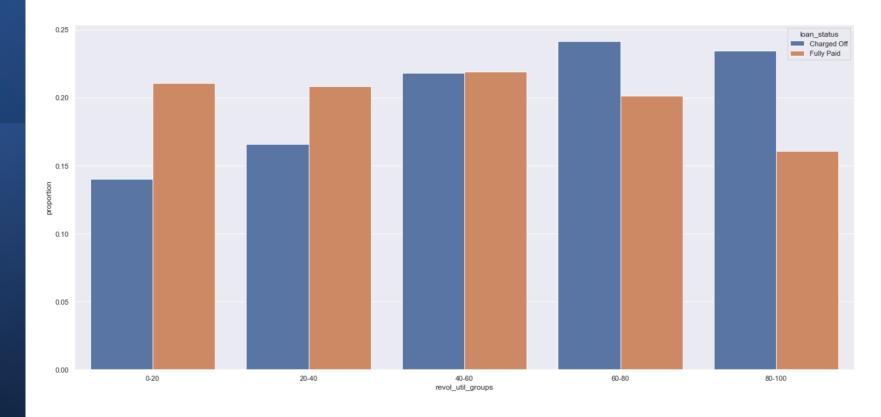
Customers with bankruptcy have higher default ratio

# Public record bankruptcy



With increase revol util the default rate is increasing

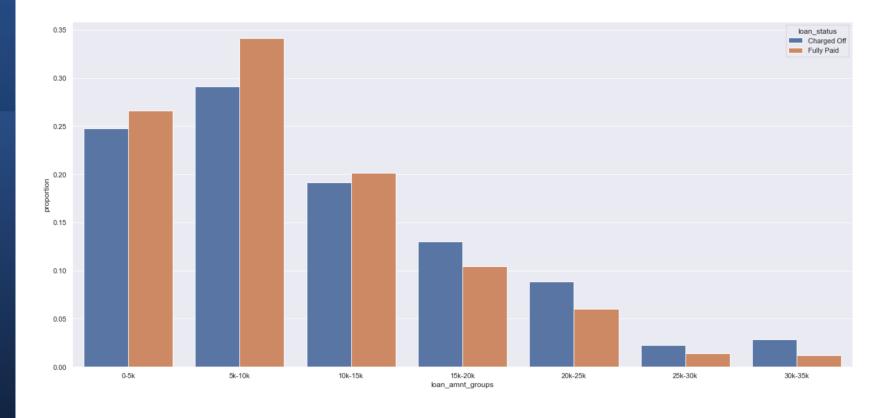
Revolving line utilization rate



Smaller loans are easy to repay

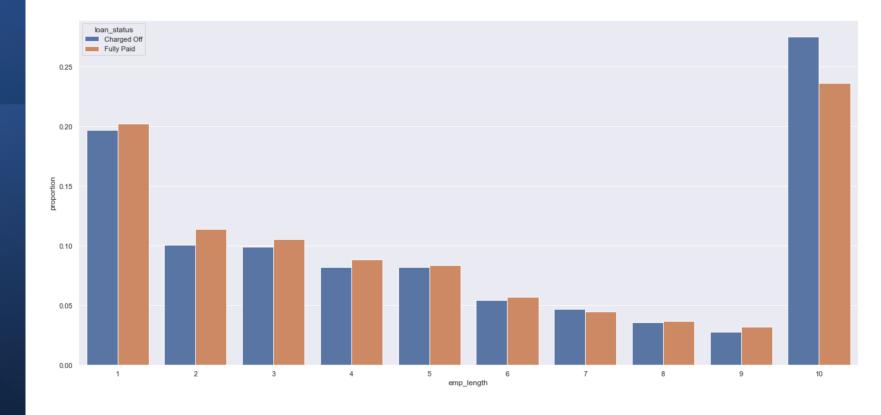
– that's what the numbers
depict

## Loan amount groups



Employees with more than 10 years experience have taken more loans than other groups and seem to have higher default ratio

### Employee length



#### Recommendations

Customers with below characteristics have higher chance to default:

- 1. Loan amount more than 15k
- 2. Higher loan duration 60 months
- 3. Interest rate more than 13%
- 4. Lowers grades (lower the grade the more chance to default)
- 5. Annual income less than 58K
- 6. Purpose for loan is either debt consolidation, other & small business
- 7. DTI value greater than 12
- 8. Having more enquiries in the last 6 months more credit hungry
- 9. Have bankruptcy record
- 10. Whose revolving line utilization ratio is more than 60%
- 11. Having 10+ years of experience