

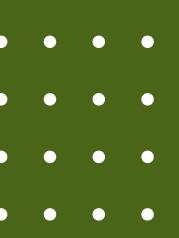




Lending Case Club Study

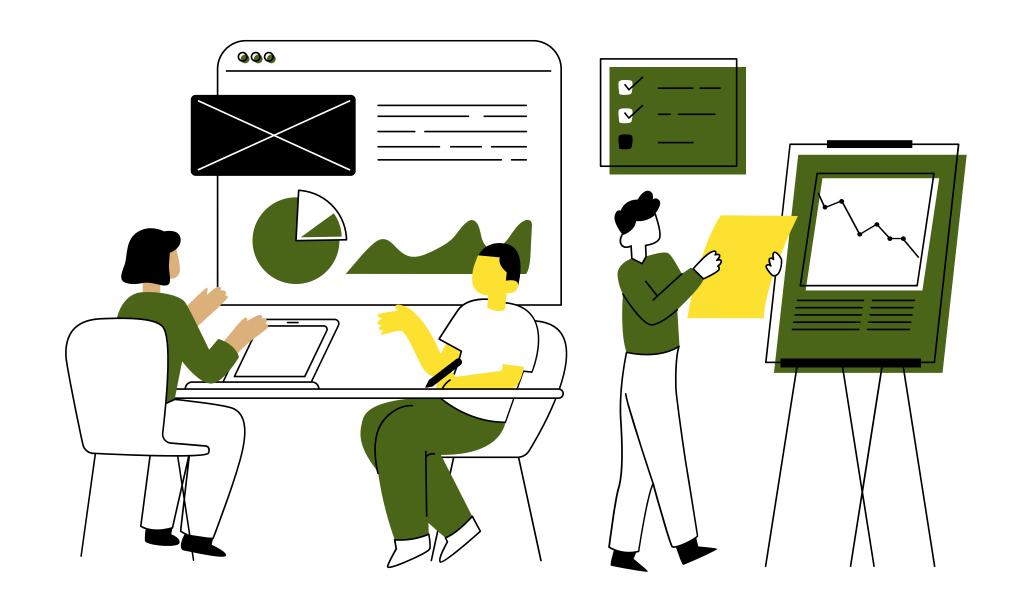
GROUP FACILITATOR: CHARU TEWARI



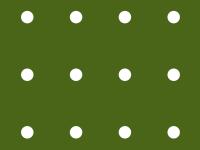


COMPANY PROFILE

Lending Club is the largest online loan marketplace, facilitating personal loans, business loans, and financing of medical procedures. Borrowers can easily access lower interest rate loans through a fast online interface.



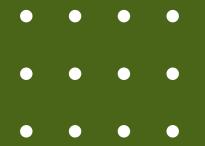
Problem Statement



Lending loans to 'risky' applicants is the largest source of financial loss (called credit loss). The credit loss is the amount of money lost by the lender when the borrower refuses to pay or runs away with the money owed.



Objective



The main objective is to be able to identify these risky loan applicants, then such loans can be reduced thereby cutting down the amount of credit loss.

Identification of such applicants using EDA is the aim of this case study.



Analysis Approach



Clean Data

Step 1

Drop columns with null values, single valued columns, random values



Step 2

Check the continuous and categorical variables; create dummy and derived variables



Step 3

Analyze the variables against each other; create derived variables

Summarize Results

Step 5

Perform correlation; how two variables effect a third



Step 4

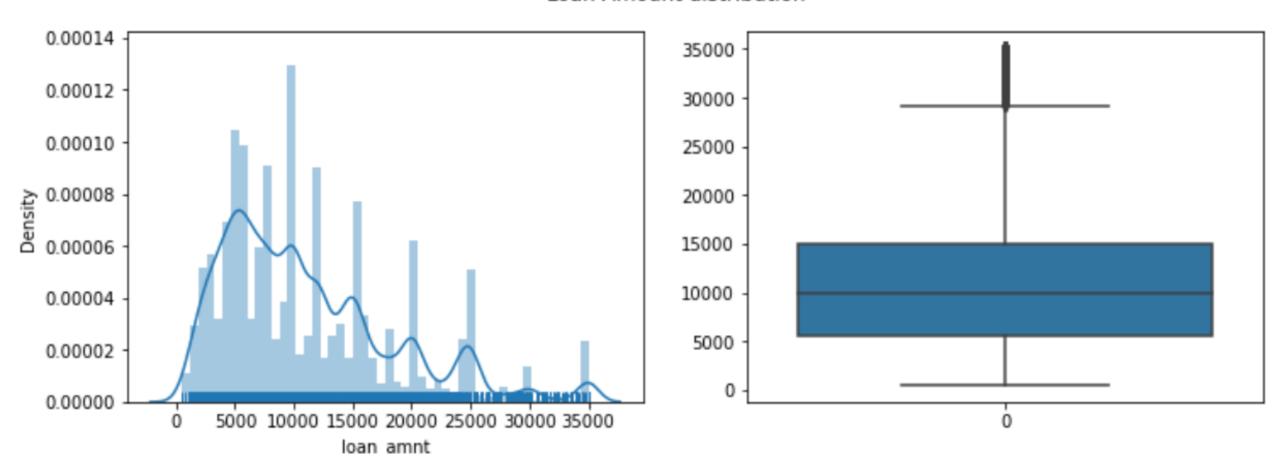
Analyze the variables against each other; create derived variables

Univariate Analysis

Loan Amount Distribution

Most of the individuals borrowed loan between **6000-15000**Only **25%** of the individuals borrowed loan more than 35000

Loan Amount distribution

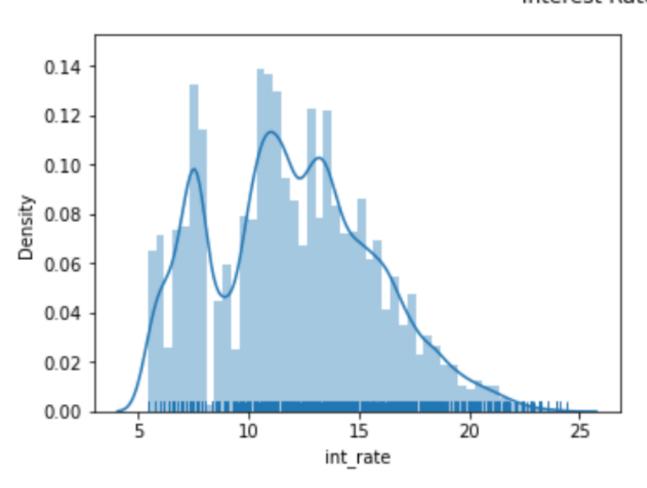


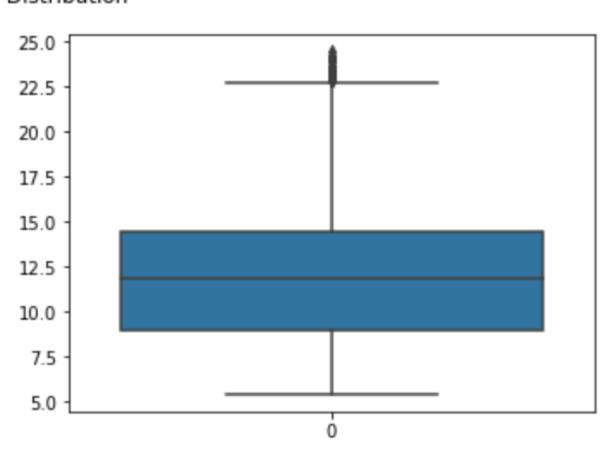
Interest Rate Distribution

Interest Rate lies mostly lies in the range **9% to 14%**Some individuals borrowed loan at **6%**

Some individuals borrowed loan at 22.5%

Interest Rate Distribution

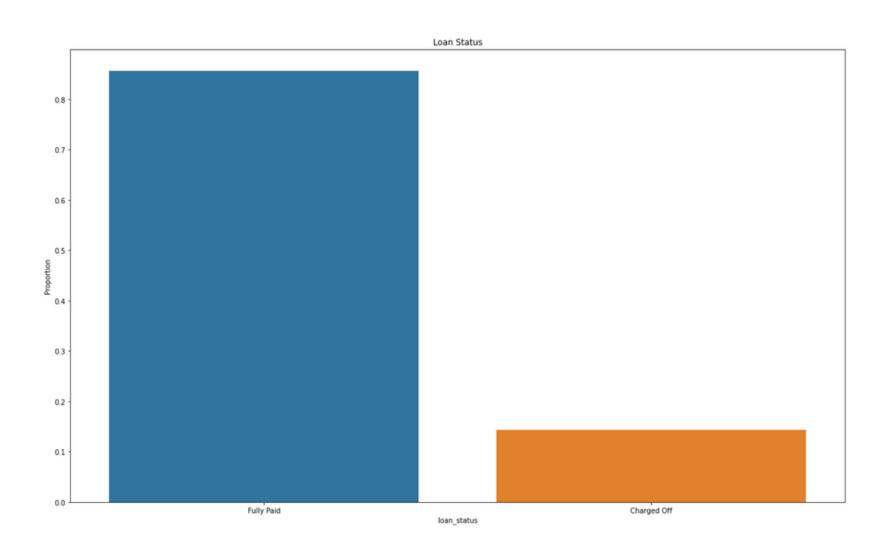


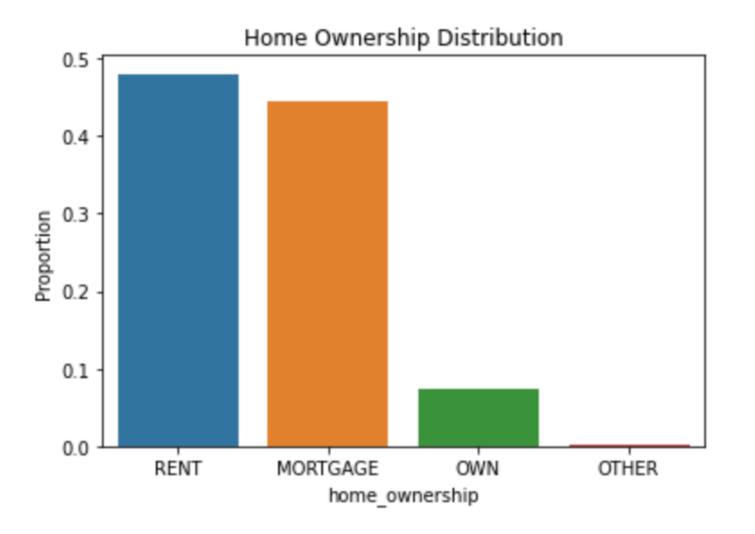


Loan Status

Almost **85%** of individuals have paid off their loans and **15%** of individuals have defaulter on their loans.

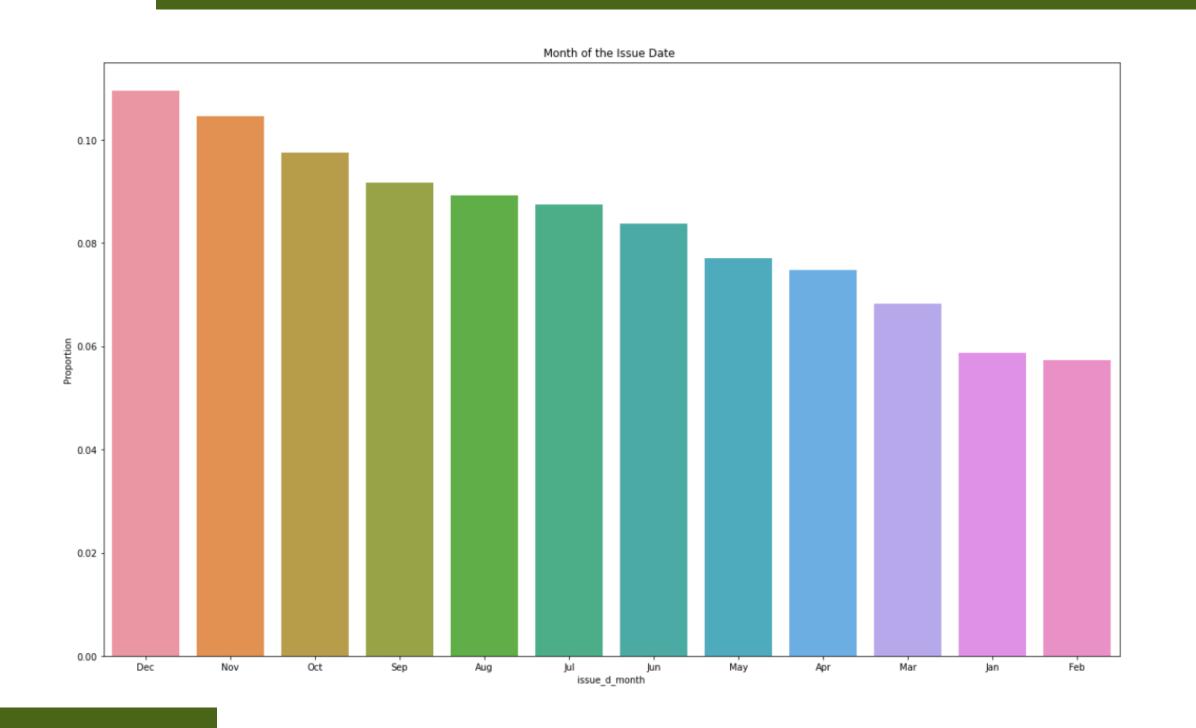
Maximum borrowers have rented home, followed by ones who mortgaged homes.





Loans By Month

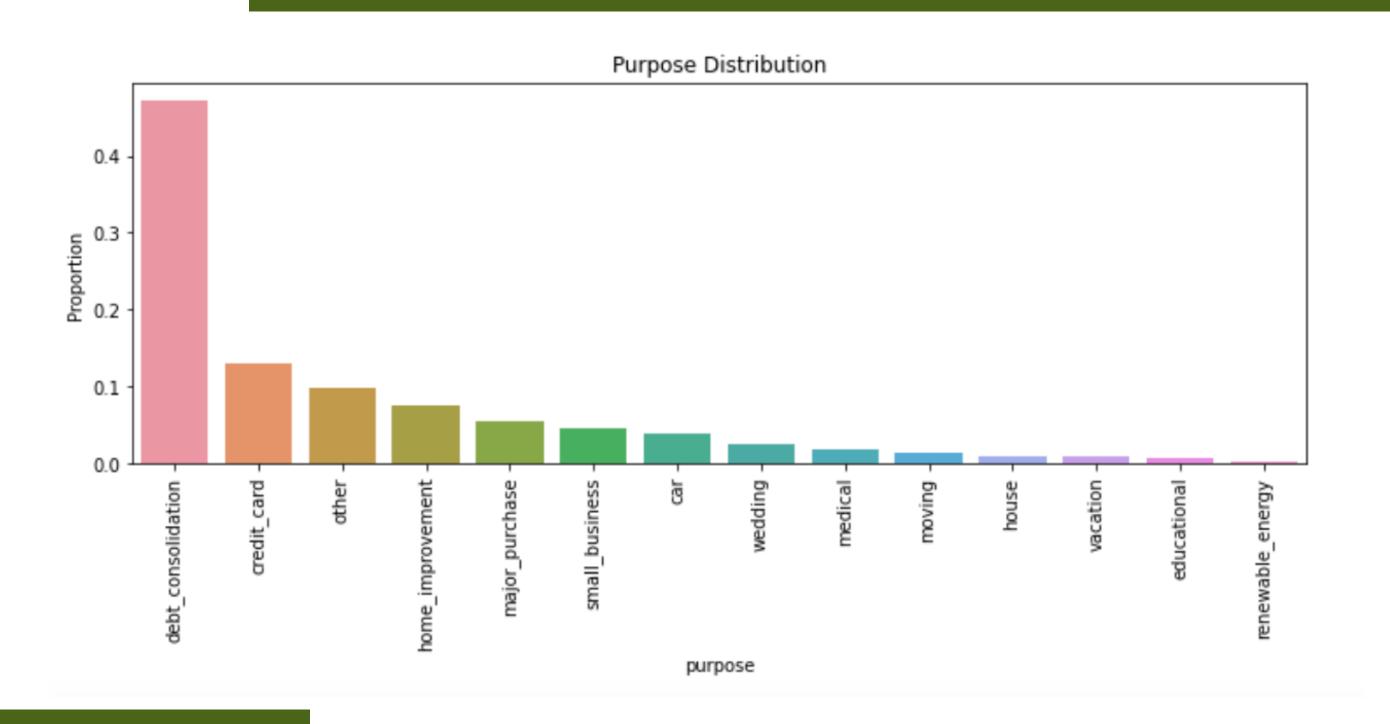
The year starts with low number of loans given, for months - Jan, Feb and March while it ends on a good note, with maximum number of loans given, for months - Sept, Oct, Nov and Dec.



Purpose of Loan

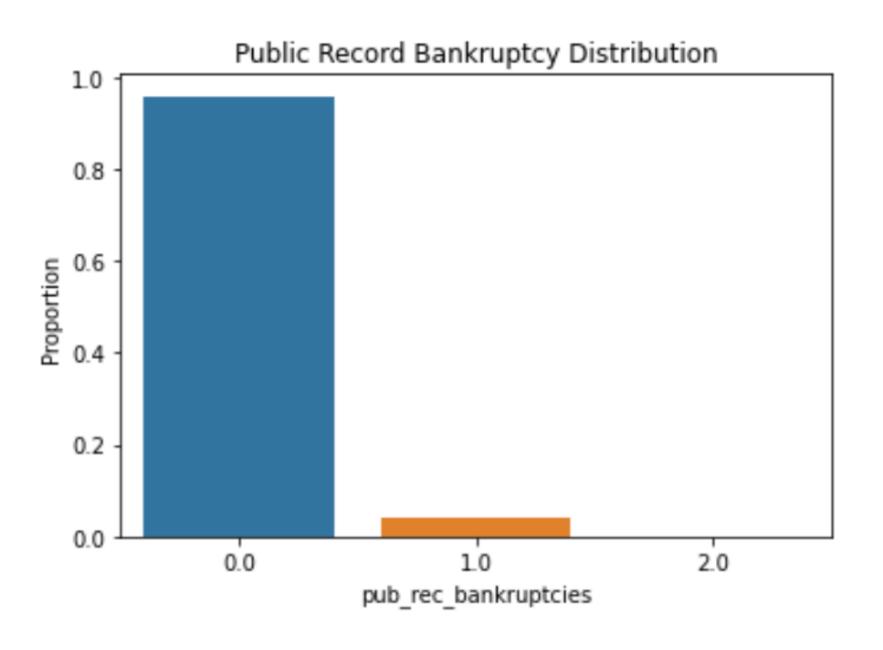
Most common reason to borrow a loan, is because of debt consolidation, followed by payment of credit card due payment.

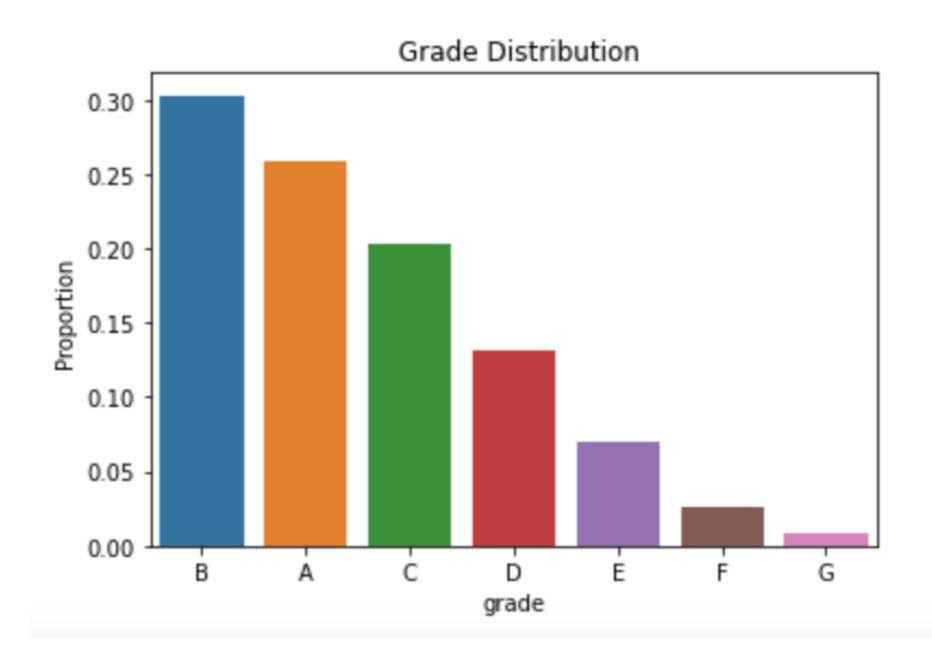
The least common reason to borrow a loan, is because of renewable energy



Public Record Bankruptcy

99% of the individuals were not bankrupt Only 1% were.

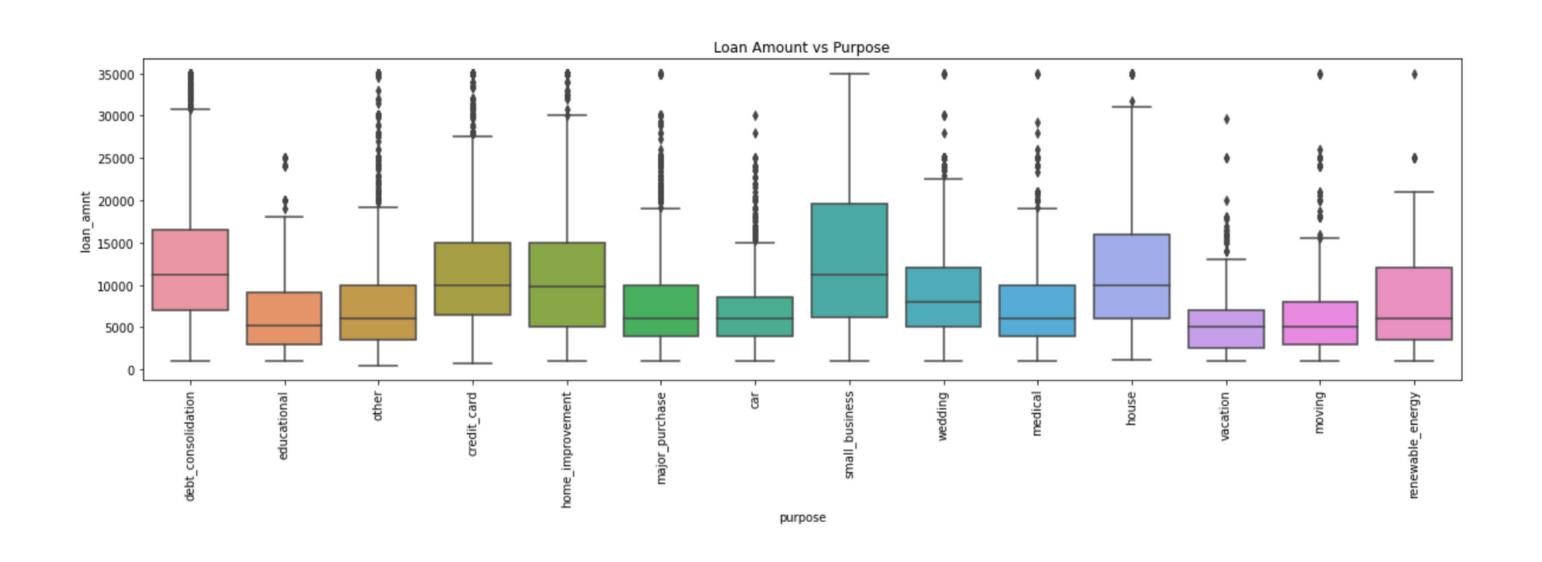




Segmented Bivariate Analysis

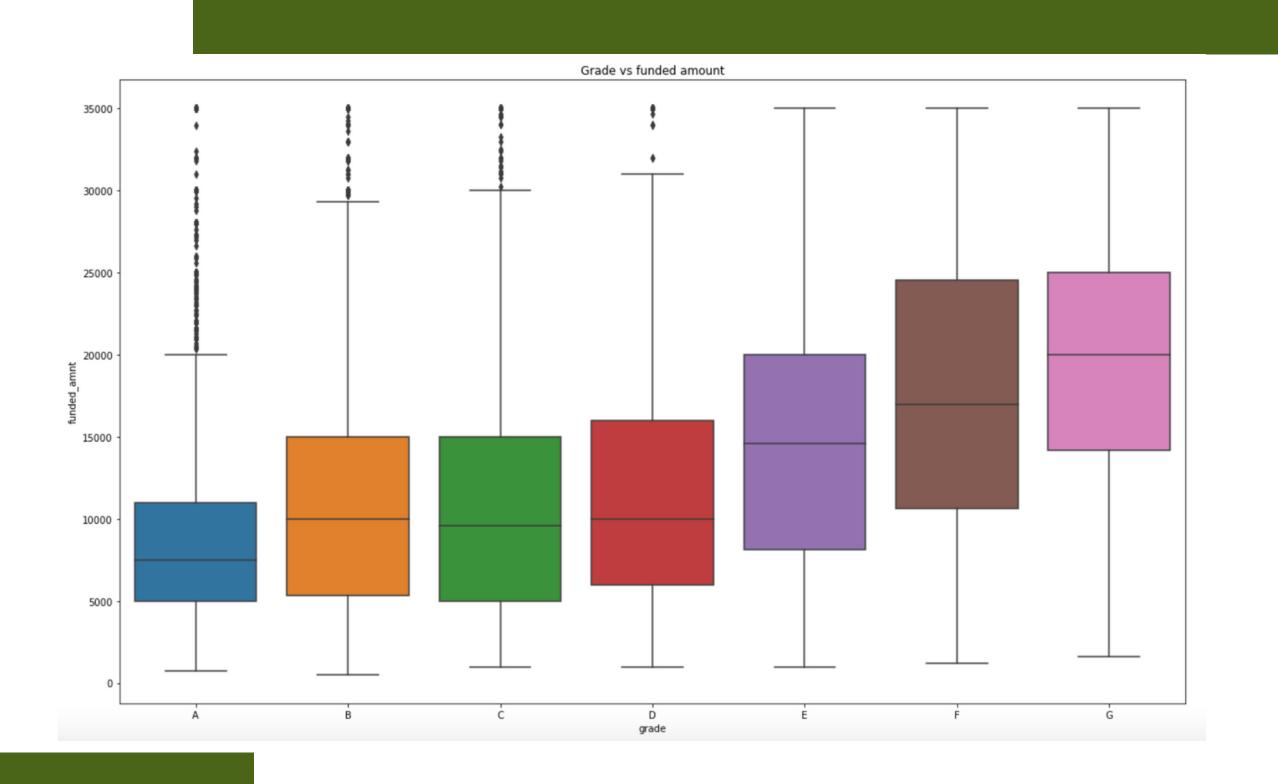
Loan Amount vs Purpose

Individuals with small businesses take large amount of loans, followed by debt_consolidation and home improvement.



Grade

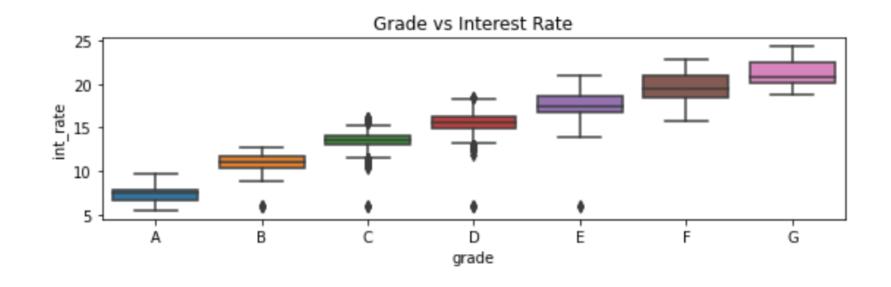
Loan amount has been funded highest for Grade G, followed by F and E.

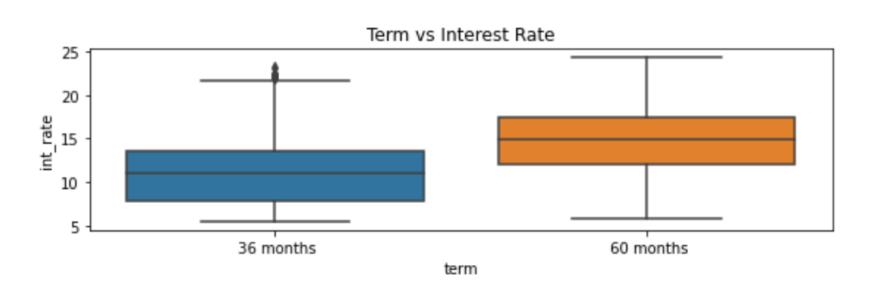


Interest Rate vs Grade and Term

The int_rate is higher for Grade G individuals, followed by grade F,E,D,C,B and A.

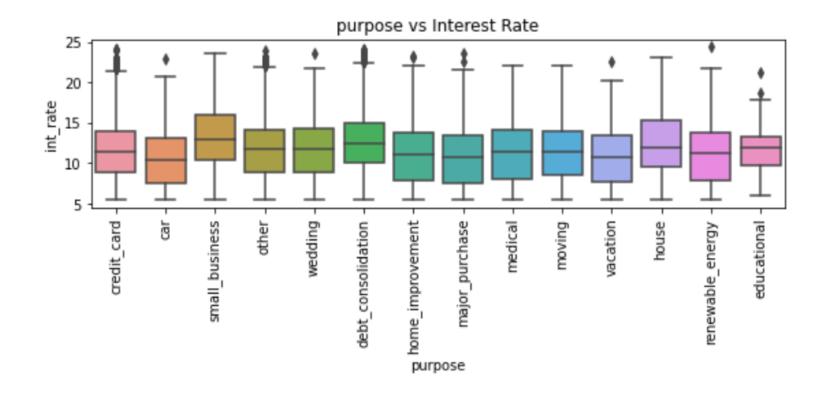
The int_rate is higher when the loan is borrowed for a period of 60 months

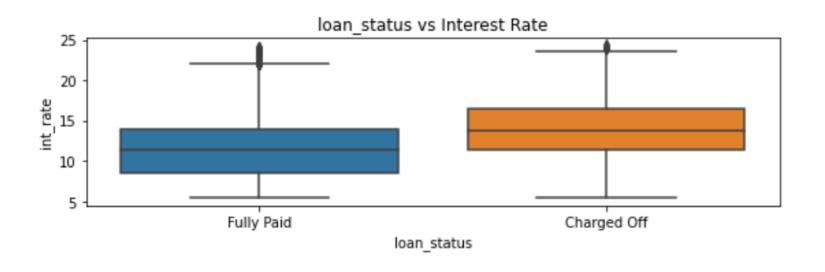




Interest Rate vs Purpose and Loan status

Interest Rate is higher for small businesses purpose, followed by house purpose.
And higher for Charged-off loans, as they have defaulted.



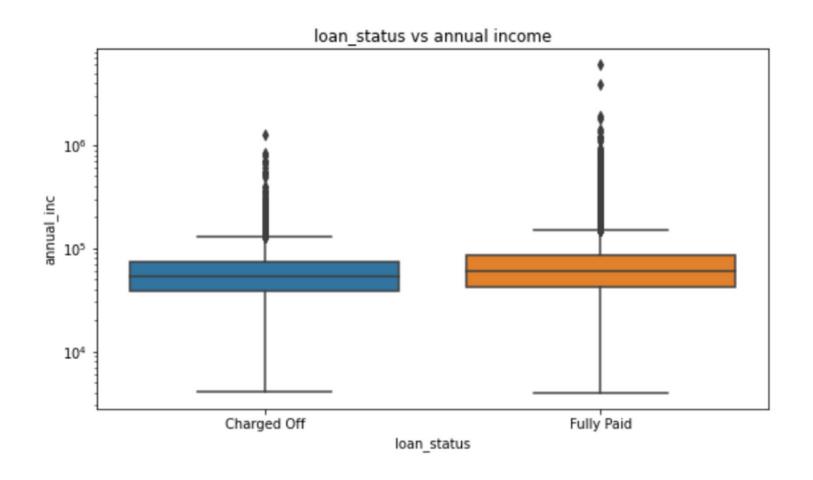


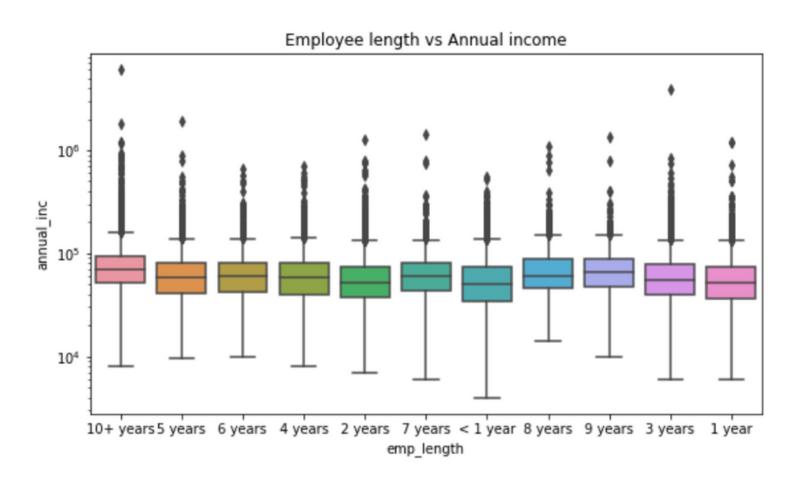
Annual Income vs Loan status and Employement Length

Loans that have been Fully Paid, belong to individuals with higher annual income.

Loans that have been Charged-Off, belong to individuals with lower annual income.

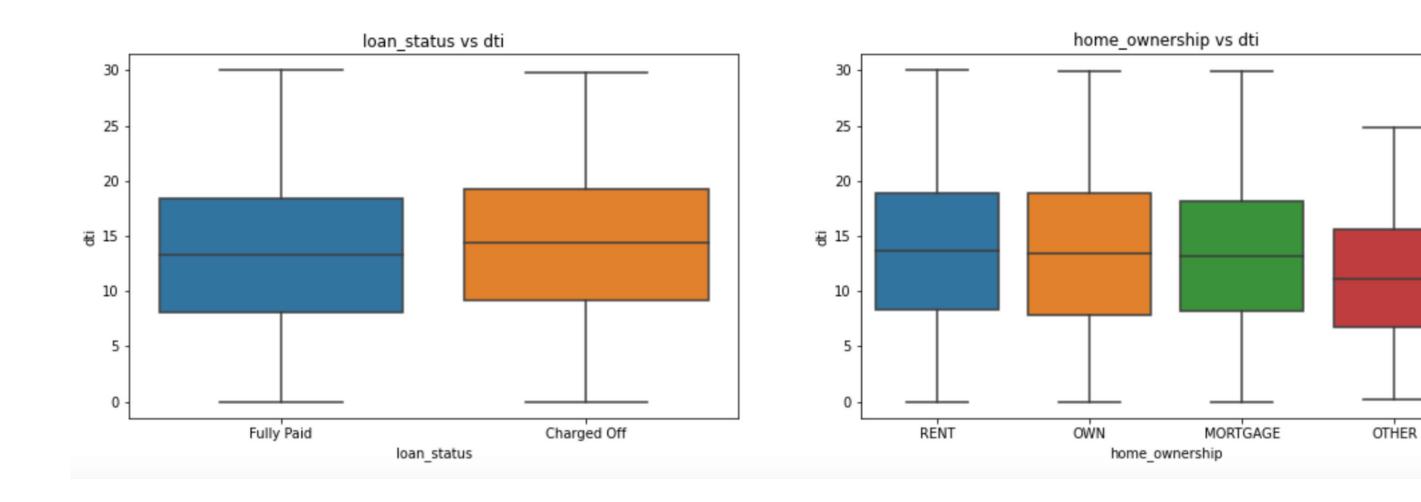
Individuals with employment length of +10 years have higher annual income, followed by 9 and 8 years.





Debt-to-income vs Loan status and Home ownership

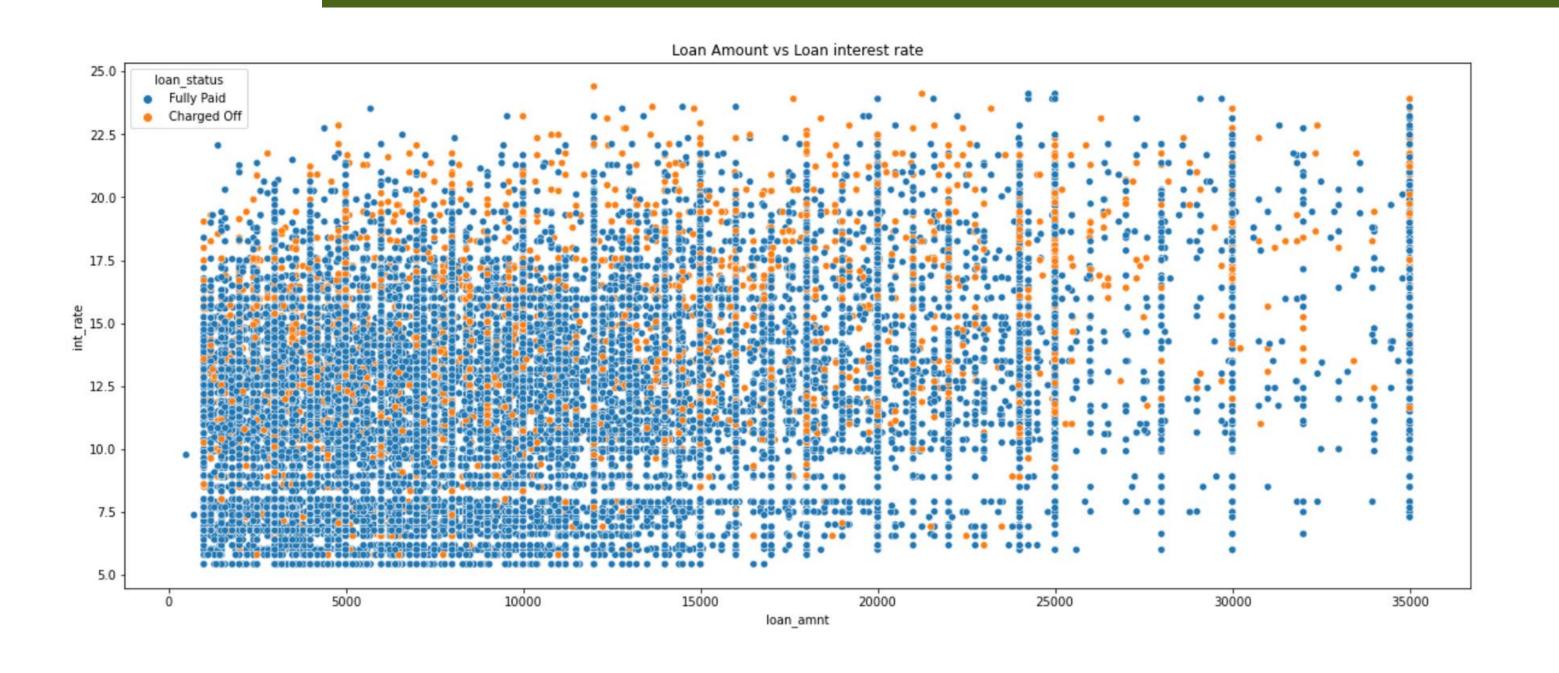
Individuals that have charged-off have higher dti, in respect to those who have fully paid their loans Individuals who are in Other category of Home ownership have higher dti than others.



Bivariate Analysis

Loan Amount vs Interest Rate

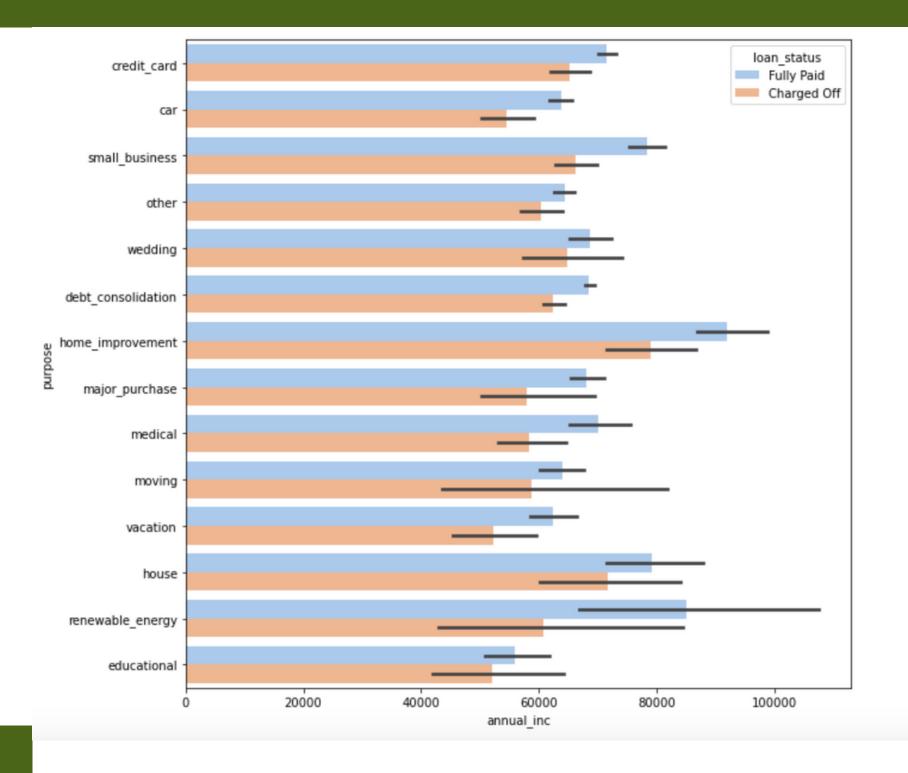
No definite pattern can be observed between Loan amount and Loan interest, we can say that, the interest is not heavily dependent on the Loan amount.



Purpose vs Annual Income

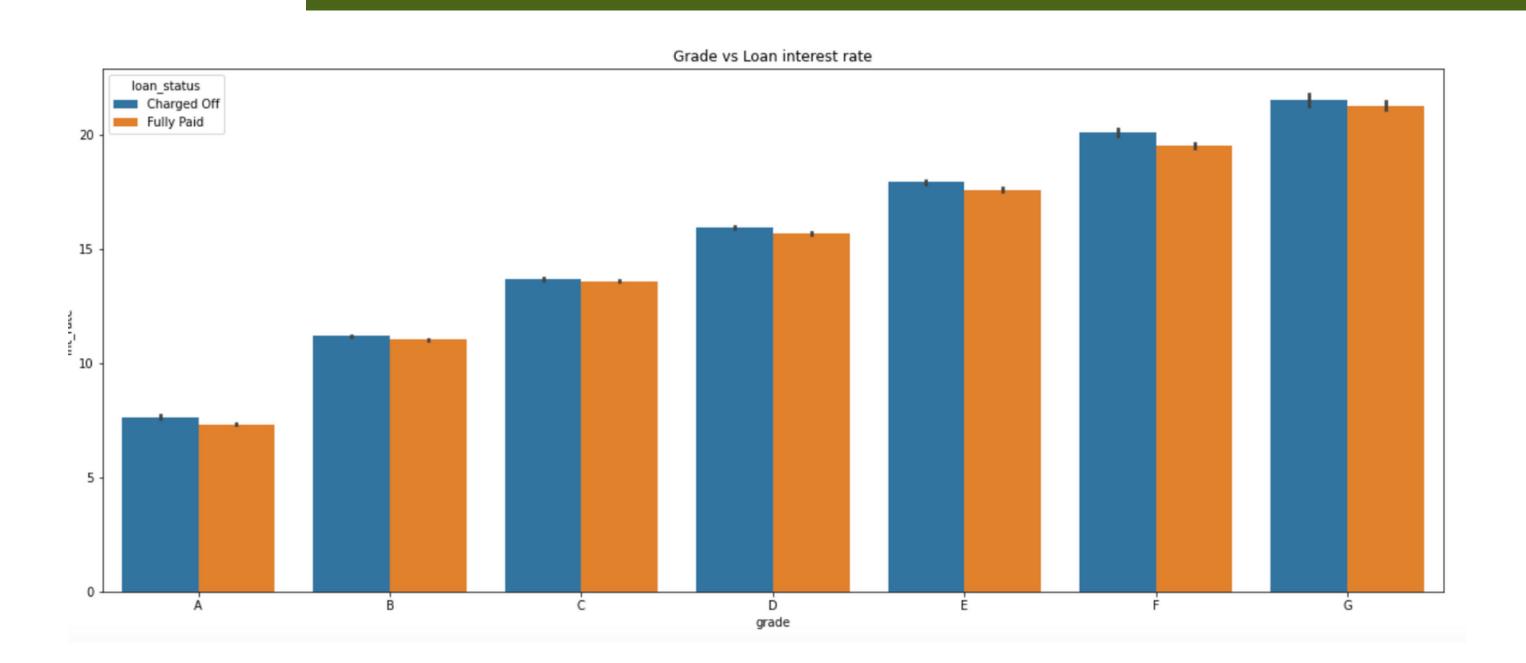
Individuals that have Fully Paid their loans, took loans for renewable energy and home improvement.

Individuals that have Charged Off, took loans for home improvement and house.



Grade vs Interest Rate

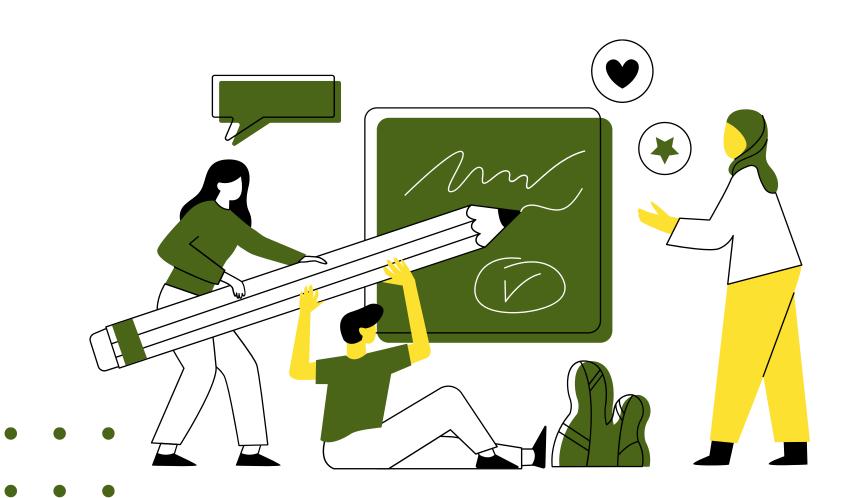
For all the grades, he interest rate is higher for Charged off individuals than the ones who Fully Paid. There is a high interest rate for Grade G individuals, followed by Grades F and E.



Correlation

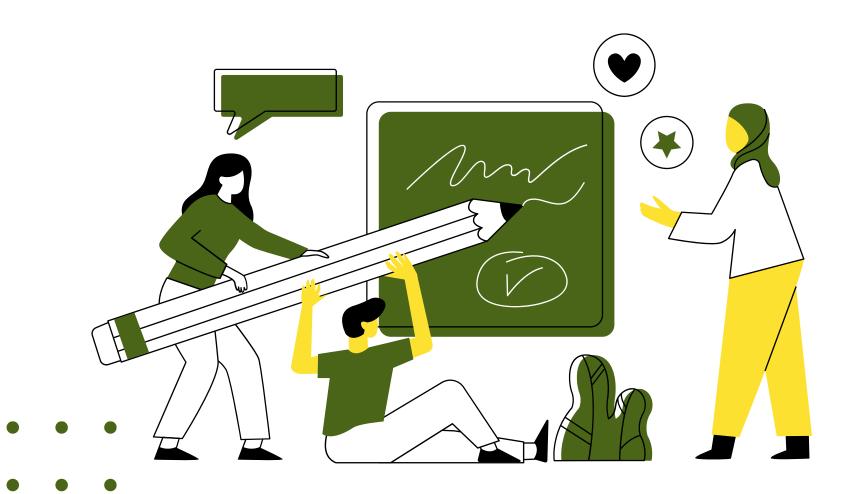
			Correlation between Columns														
member_id -	1	0.12	0.14	0.21	0.042	0.078	0.011	0.081	-0.003	-0.043	0.017	-0.025	-0.0012	0.033	0.11	0.14	-0.01
loan_amnt -	0.12	1	0.98	0.95	0.3	0.93	0.27	0.06	-0.035	0.011	0.17	-0.047	0.32	0.26	0.88	0.48	-0.032
funded_amnt -	0.14	0.98		0.97	0.3	0.96	0.27	0.06	-0.035	0.011	0.17	-0.048	0.31	0.25	0.9	0.48	-0.033
funded_amnt_inv -	0.21	0.95	0.97		0.29	0.92	0.26	0.063	-0.039	0.00016	0.16	-0.052	0.29	0.24	0.89	0.47	-0.038
int_rate -	0.042	0.3	0.3	0.29	1	0.28	0.048	0.11	0.16	0.14	0.0086	0.099	0.096	-0.046	0.29	0.17	0.083
installment -	- 0.078	0.93	0.96	0.92	0.28	1	0.27	0.05	-0.023	0.009	0.17	-0.043	0.31	0.23	0.86	0.41	-0.029
annual_inc -	0.011	0.27	0.27	0.26	0.048	0.27	1	-0.12	0.021	0.035	0.16	-0.014	0.28	0.24	0.26	0.14	-0.012
dti -	- 0.081	0.06	0.06	0.063	0.11	0.05	-0.12	1	-0.035	0.00067	0.29	-0.0054	0.23	0.23	0.058	0.0077	0.0064
delinq_2yrs -	-0.003	-0.035	-0.035	-0.039	0.16	-0.023	0.021	-0.035	1	0.0084	0.011	0.011	-0.056	0.067	-0.025	-0.013	0.0058
inq_last_6mths -	-0.043	0.011	0.011	0.00016	0.14	0.009	0.035	0.00067	0.0084	1	0.094	0.023	-0.025	0.12	-0.0088	0.028	0.014
open_acc -	0.017	0.17	0.17	0.16	0.0086	0.17	0.16	0.29	0.011	0.094	1	0.0034	0.29	0.69	0.16	0.08	0.0091
pub_rec -	0.025	-0.047	-0.048	-0.052	0.099	-0.043	-0.014	-0.0054	0.011	0.023	0.0034	1	-0.059	-0.02	-0.05	-0.034	0.84
revol_bal -	-0.0012	0.32	0.31	0.29	0.096	0.31	0.28	0.23	-0.056	-0.025	0.29	-0.059	1	0.31	0.29	0.13	-0.047
total_acc -	- 0.033	0.26	0.25	0.24	-0.046	0.23	0.24	0.23	0.067	0.12	0.69	-0.02	0.31	1	0.22	0.17	-0.0067
total_pymnt -	0.11	0.88	0.9	0.89	0.29	0.86	0.26	0.058	-0.025	-0.0088	0.16	-0.05	0.29	0.22	1	0.51	-0.039
last_pymnt_amnt -	0.14	0.48	0.48	0.47	0.17	0.41	0.14	0.0077	-0.013	0.028	0.08	-0.034	0.13	0.17	0.51	1	-0.023
rec_bankruptcies -	-0.01	-0.032	-0.033	-0.038	0.083	-0.029	-0.012	0.0064	0.0058	0.014	0.0091	0.84	-0.047	-0.0067	-0.039	-0.023	1
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	member id -	loan_amnt -	funded_amnt -	unded amnt inv	int_rate -	installment -	annual inc -	Ĵ	delinq_2yrs -	inq_last_6mths	oben_acc -	pub_rec	revol_bal -	total_acc -	total pymnt -	ast_pymnt_amnt	ec_bankruptcies
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Correlation Takeaways

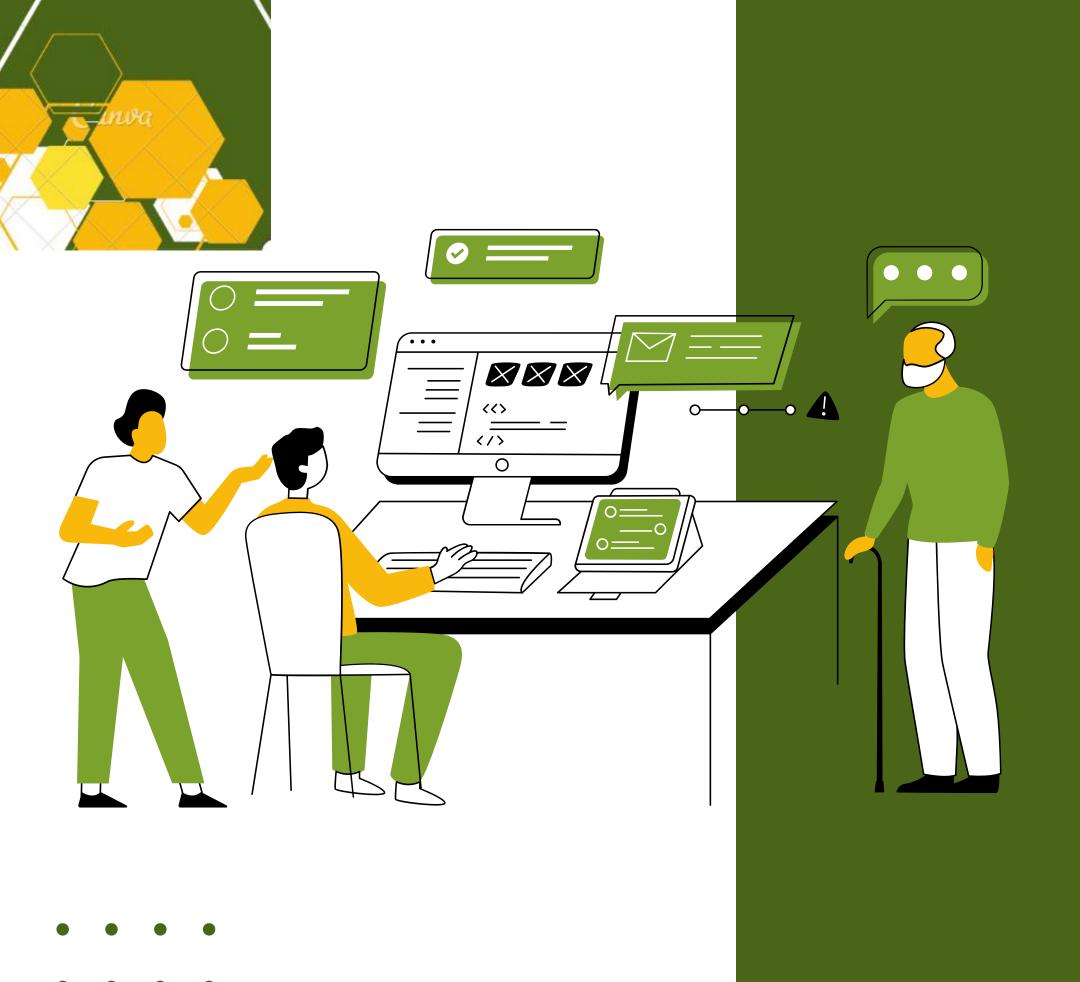


- Total payment column is highly and positively correlated with installment column.
- Total payment column is highly and positively correlated with total amount column.
- Public derogatory records column is highly and positively correlated with public bankruptcies records column
- A high and positive correlation between Loan amount column and Funded amount suggests that, the amount asked and the amount funded by the lending club are almost same.

Recommendations



- Loan should not be approved for individuals without complete verification.
- Reduce the number of Loan approvals where the purpose is small businesses.
- Reduce/Stop approving loans to individual with bad Public derogatory record and public bankruptcies record.
- Stop giving Loan of high amount to individual with low income, as they are likely to default.



THANK YOU

