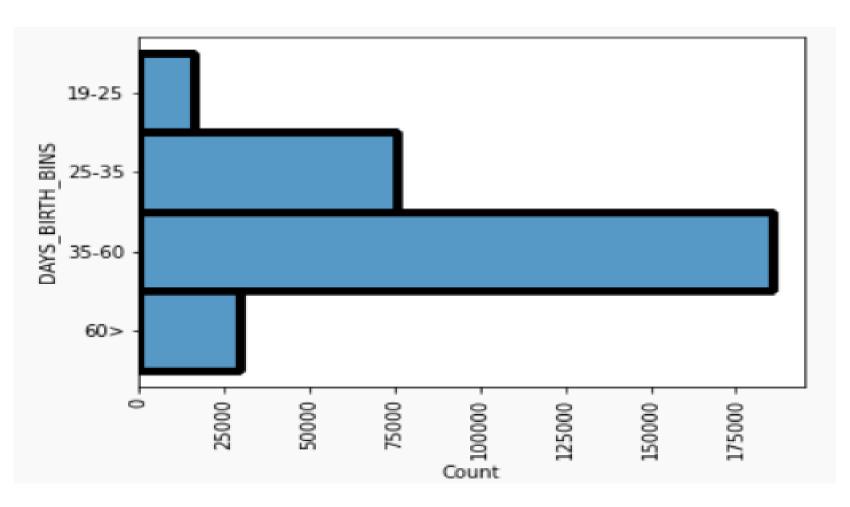


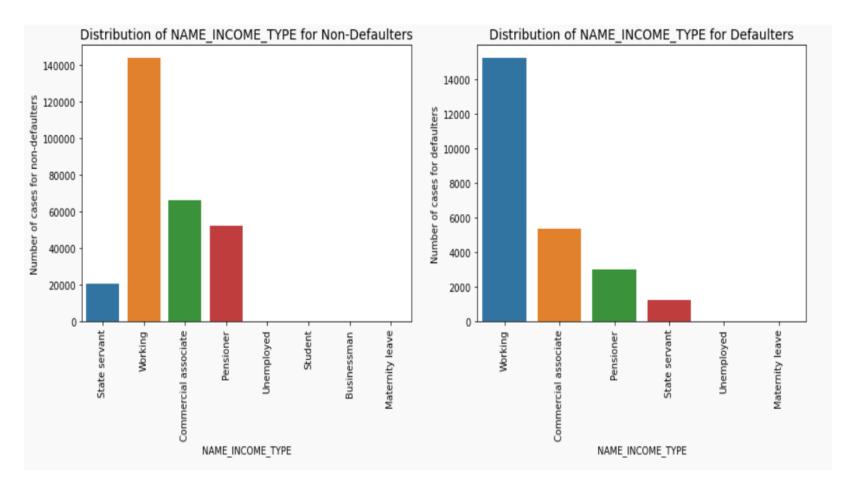
Cash Loans vs Revolving Loans

- We can notice that revolving loans are lesser in the defaulted population.
- Hence we can infer that revolving loans are comparatively safer.
- This may be attributed to the Nature of revolving loan as it is considered a flexible financing tool due to its repayment and re-borrowing flexibility



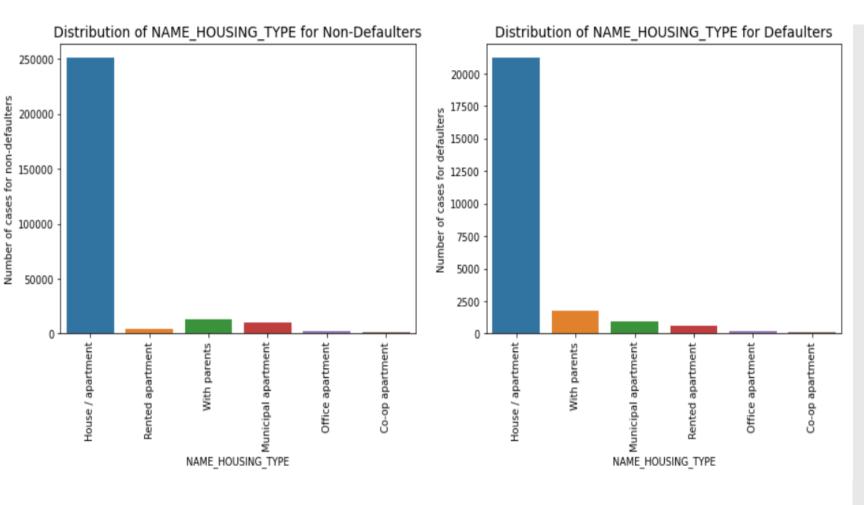
Age analysis after binning

- We can observe that most of our population lies between the age of 35-60.
- The least amount population lies in between the age group 19-25.



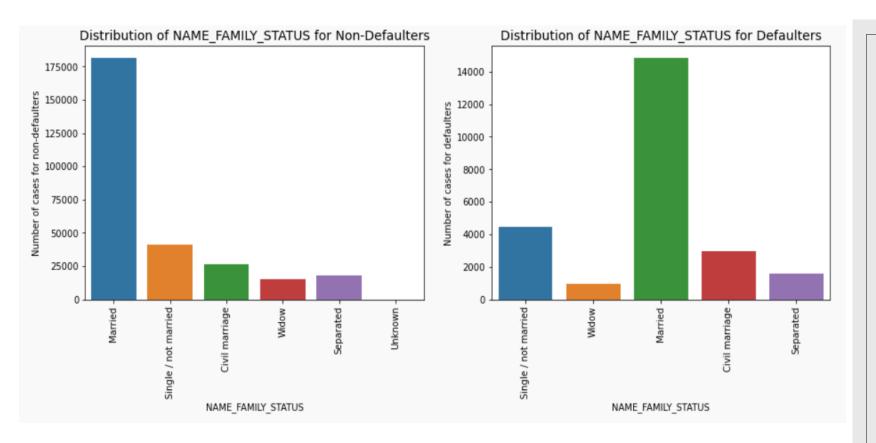
Income Types Distribution

- Working population has the highest amount of defaulters
- State Servant have very low default population as they have secure jobs with steady income.



Housing type distribution

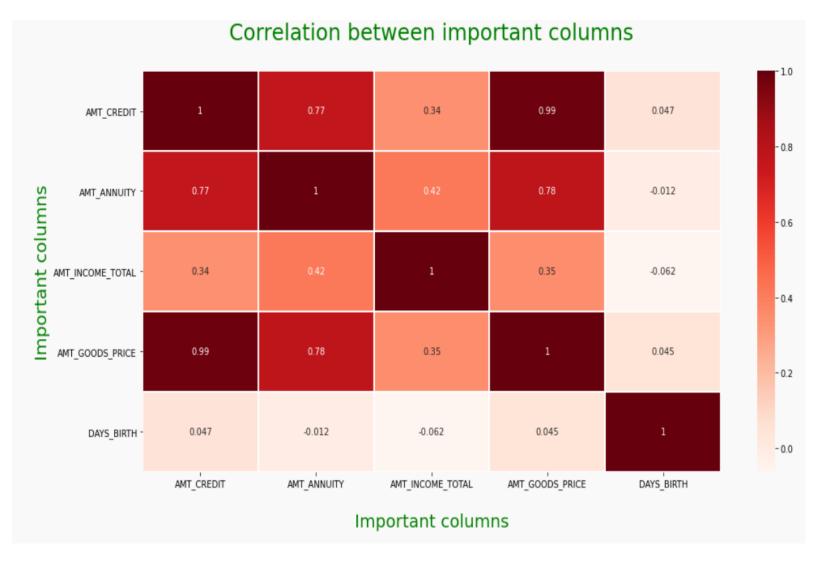
- Population living in Rented apartments and those living with parents have higher default rate.
- Living in rental apartment means a cash outflow towards rent and thus less cash left for repayment of loan.
- Living with parents may suggest that the income is not too high and thus difficulty in repayment of loan.



Family Status Distributions

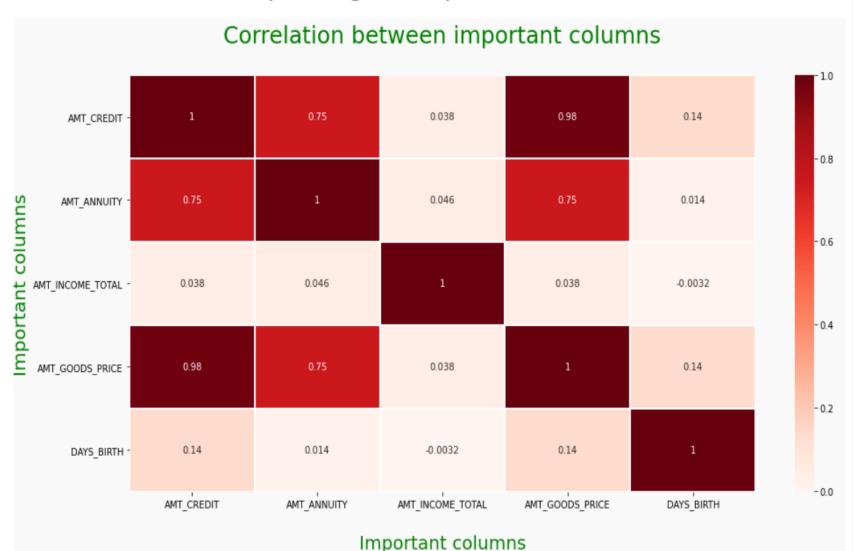
- The highest amount of non-defaulters are married people.
- On the other side we can also observe the highest amount from defaulters population are married.
- The least amount of defaulters are widow and separated.

Correlation between Important columns (Target 0)



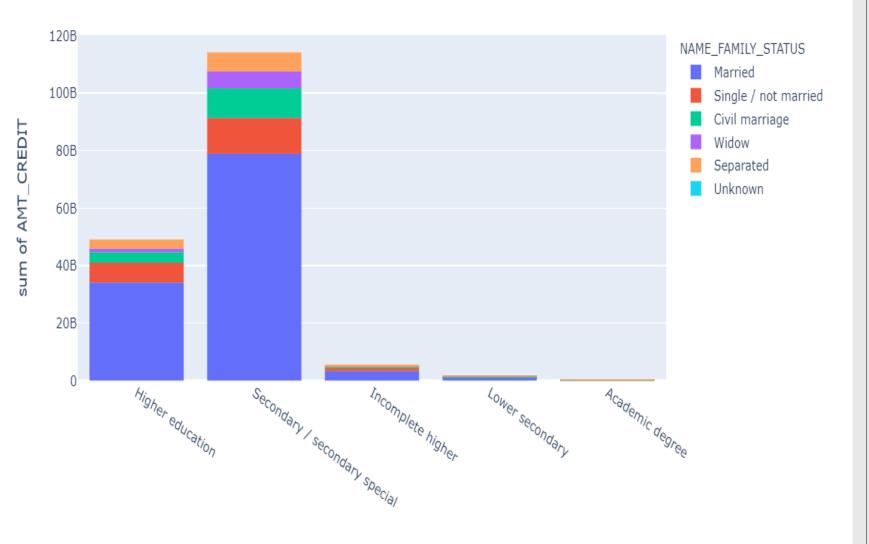
- Credit amount is related to Goods price as the higher the price the higher the amount of credit taken by customer and vice versa.
- Annuity amount and Credit amount is also related as higher credit amount has a higher annuity.
- Therefore annuity amount and Goods price amount is also correlated as higher price of goods results in higher credit amount which eventually results in higher annuity amount.

Correlation between Important columns (Target 1)



- The Target 1 population are people with payment difficulties.
- Target 1 heat map looks similar but there are a few changes like there is very little relation between Amount of total income and amount of annuity compared to Target 0 population

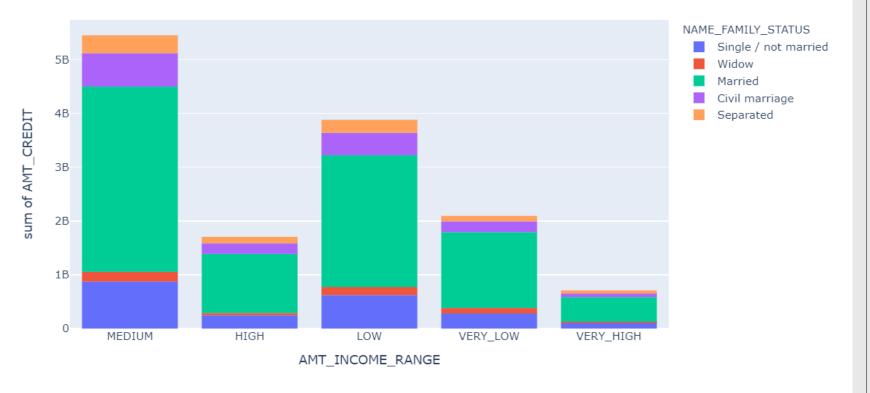
Credit amount vs Education of Loan-Payment Difficulties



Credit amount vs Education of loan-Payment difficulties

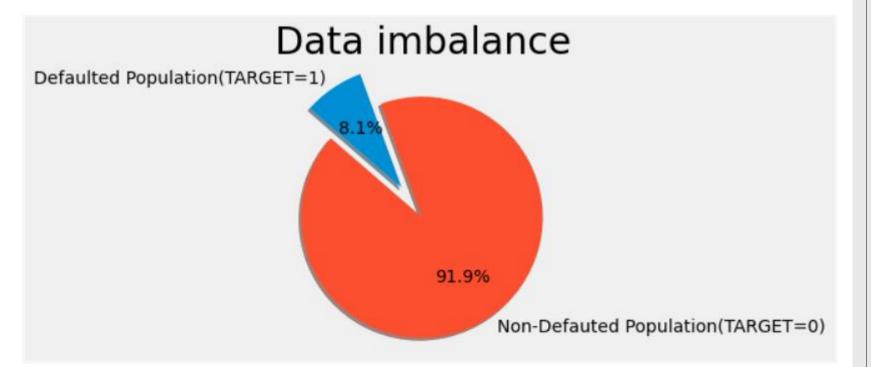
- People with secondary and higher education have higher credit amount compared to other categories.
- The majority of higher and secondary credit amount is occupied by married people

Income range vs Credit amount of Loan Payment Difficulties



Income range vs Credit amount

- The highest amount of credit is for people with medium income, followed by people with low income.
- The lowest amount of credit is for people with very high income, as people with very high income rarely need credit or loans.



Data Imbalance

More than 90% of the population consists of people who are Target=0, i.e. people with no payment difficulties/defaulted on loans.

Previous Data Application Analysis.

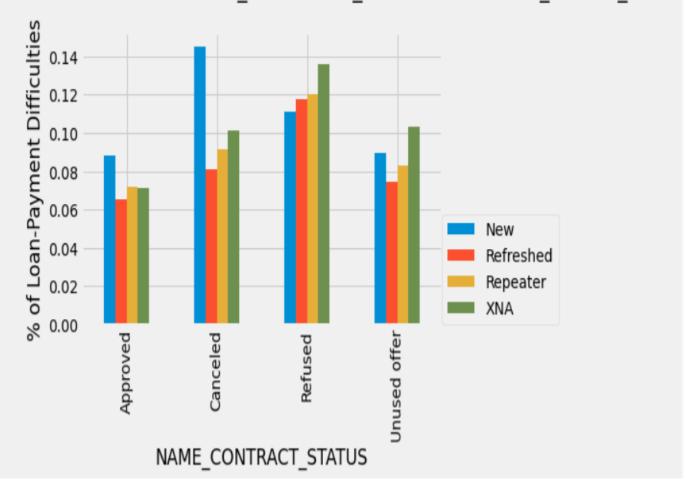


Client type while applying for the previous application

- We can observe that the client type is highest for repeater while applying for the previous application.
- The second highest population is for the new client type followed by refreshed.

Bivariate Analysis After Merging Previous Data

% of Loan Payment Difficulties for NAME_CONTRACT_STATUS and NAME_CLIENT_TYPE

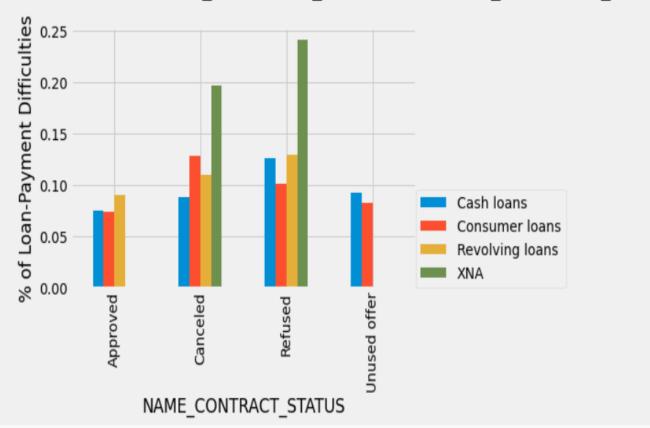


Contract status vs Client type

- The highest amount of approved loans are of new client type.
- The highest amount of cancelled loans are also of new client type.
- The highest amount of refused loans are also of repeater client type.
- The highest amount of unused offer are of new client type

Bivariate Analysis After Merging Previous Data

% of Loan Payment Difficulties for NAME_CONTRACT_STATUS and NAME_CONTRACT_TYPE



Contract status vs Contract type

- The highest amount approved loans are revolving loans.
- The highest amount of cancelled loans are consumer loans
- The highest amount of refused loans are revolving loans.
- The most unused offer are cash loans.

Conclusion

- Banks should focus less on income type 'Working' as they are having most number of unsuccessful payments.
- Banks should focus more on contract type 'Student', 'pensioner', 'state servant' and 'Businessman' for successful payments.
- Banks should accept more revolving loans as they are less defaulted compared to cash loans.
- Banks should also focus on people with Family status as 'widow' and 'separated' as they have the least amount of defaulters compared to other Family Status.