# Business Understanding

Many people struggle to get loans due to insufficient or non-existent credit histories. And, unfortunately, this population is often taken advantage of by untrustworthy lenders.

[Home Credit](http://www.homecredit.net/) strives to broaden financial inclusion for the unbanked population by providing a positive and safe borrowing experience. In order to make sure this underserved population has a positive loan experience, Home Credit makes use of a variety of alternative data--including telco and transactional information--to predict their clients' repayment abilities.

While Home Credit is currently using various statistical and machine learning methods to make these predictions, they're challenging Kagglers to help them unlock the full potential of their data. Doing so will ensure that clients capable of repayment are not rejected and that loans are given with a principal, maturity, and repayment calendar that will empower their clients to be successful.

# Data Understanding/Preprocessing

## Table Understanding

* application\_{train|test}.csv
  + This is the main table, broken into two files for Train (with TARGET) and Test (without TARGET).
  + Static data for all applications. One row represents one loan in our data sample.
* bureau.csv
  + All client's previous credits provided by other financial institutions that were reported to Credit Bureau (for clients who have a loan in our sample).
  + For every loan in our sample, there are as many rows as number of credits the client had in Credit Bureau before the application date.
* bureau\_balance.csv
  + Monthly balances of previous credits in Credit Bureau.
  + This table has one row for each month of history of every previous credit reported to Credit Bureau – i.e the table has (#loans in sample \* # of relative previous credits \* # of months where we have some history observable for the previous credits) rows.
* POS\_CASH\_balance.csv
  + Monthly balance snapshots of previous POS (point of sales) and cash loans that the applicant had with Home Credit.
  + This table has one row for each month of history of every previous credit in Home Credit (consumer credit and cash loans) related to loans in our sample – i.e. the table has (#loans in sample \* # of relative previous credits \* # of months in which we have some history observable for the previous credits) rows.
* credit\_card\_balance.csv
  + Monthly balance snapshots of previous credit cards that the applicant has with Home Credit.
  + This table has one row for each month of history of every previous credit in Home Credit (consumer credit and cash loans) related to loans in our sample – i.e. the table has (#loans in sample \* # of relative previous credit cards \* # of months where we have some history observable for the previous credit card) rows.
* previous\_application.csv
  + All previous applications for Home Credit loans of clients who have loans in our sample.
  + There is one row for each previous application related to loans in our data sample.
* installments\_payments.csv
  + Repayment history for the previously disbursed credits in Home Credit related to the loans in our sample.
  + There is a) one row for every payment that was made plus b) one row each for missed payment.
  + One row is equivalent to one payment of one installment OR one installment corresponding to one payment of one previous Home Credit credit related to loans in our sample.
* HomeCredit\_columns\_description.csv
  + This file contains descriptions for the columns in the various data files.



## Single Column Understanding

**Key:**

application\_{train}.SK\_ID\_CURR, bureau. SK\_ID\_BUREAU

**Label:**

application\_{train}.TARGET

1 - client with payment difficulties

**Possible Features:**

|  |  |  |
| --- | --- | --- |
| **Feature Name** | **Type** | **Note** |
| NAME\_CONTRACT\_TYPE | Categorical | "Cash loans", "Revolving loans" |
| CODE\_GENDER | Categorical | "F","M","XNA" |
| FLAG\_OWN\_CAR | Categorical | "N","Y" |
| FLAG\_OWN\_REALTY | Categorical | "N","Y" |
| CNT\_CHILDREN | Real Number | Clip to 2.5 |
| AMT\_INCOME\_TOTAL | Real Number | Clip to 337500 |
| AMT\_CREDIT | Real Number | Clip to 1616625 |
| AMT\_ANNUITY | Real Number | Clip to 61704 |
| AMT\_GOODS\_PRICE | Real Number | Clip to 1341000 |
| NAME\_TYPE\_SUITE | Categroical |  |
| NAME\_INCOME\_TYPE | Categroical |  |
| NAME\_EDUCATION\_TYPE | Categroical |  |
| NAME\_FAMILY\_STATUS | Categroical |  |
| NAME\_HOUSING\_TYPE | Categroical |  |
| REGION\_POPULATION\_RELATIVE | Real Number | Clip to 0.057 |
| DAYS\_BIRTH | Category | This should be converted to years, then converted to bucketized\_Column(from 18-78) |
| DAYS\_EMPLOYED | Category | This should be converted to years, then converted to bucketized\_Column (From 0 to 60) |
| DAYS\_REGISTRATION | Category | Same as above |
| DAYS\_ID\_PUBLISH | Category | Same as above |
| OWN\_CAR\_AGE | Real Number | Clip to 30 |
| FLAG\_MOBIL | Category | This column should be neglected since all of them expect one record is 0 and the user is a normal user. |
| FLAG\_EMP\_PHONE | Category | This needs to be changed to Category |
| FLAG\_WORK\_PHONE | Category | This needs to be changed to Category |
| FLAG\_CONT\_MOBILE | Category | This needs to be changed to Category |
| FLAG\_PHONE | Category | This needs to be changed to Category |
| FLAG\_EMAIL | Category | This needs to be changed to Category |
| OCCUPATION\_TYPE | Category |  |
| CNT\_FAM\_MEMBERS | Real Number | Clip to 4.5 |
| REGION\_RATING\_CLIENT | Category | This needs to be changed to Category |
| REGION\_RATING\_CLIENT\_W\_CITY | Category | This needs to be changed to Category |
| WEEKDAY\_APPR\_PROCESS\_START | Real Number | This column will be neglected |
| HOUR\_APPR\_PROCESS\_START | Real Number | This column will be neglected |
| REG\_REGION\_NOT\_LIVE\_REGION | Category | This needs to be changed to Category |
| REG\_REGION\_NOT\_WORK\_REGION | Category | This needs to be changed to Category |
| LIVE\_REGION\_NOT\_WORK\_REGION | Category | This needs to be changed to Category |
| REG\_CITY\_NOT\_LIVE\_CITY | Category | This needs to be changed to Category |
| REG\_CITY\_NOT\_WORK\_CITY | Category | This needs to be changed to Category |
| LIVE\_CITY\_NOT\_WORK\_CITY | Category | This needs to be changed to Category |
| ORGANIZATION\_TYPE | Category |  |
| EXT\_SOURCE\_1 | RealNumber |  |
| EXT\_SOURCE\_2 | RealNumber |  |
| EXT\_SOURCE\_2 | RealNumber |  |
| APARTMENTS\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| BASEMENTAREA\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BEGINEXPLUATATION\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BUILD\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| COMMONAREA\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| ELEVATORS\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| ENTRANCES\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMAX\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMIN\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| LANDAREA\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAPARTMENTS\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAREA\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAPARTMENTS\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAREA\_AVG | RealNumber | Keep unchanged at the moment, maybe clip later |
| APARTMENTS\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| BASEMENTAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BEGINEXPLUATATION\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BUILD\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| COMMONAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| ELEVATORS\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| ENTRANCES\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMAX\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMIN\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| LANDAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAPARTMENTS\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAPARTMENTS\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| APARTMENTS\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| BASEMENTAREA\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BEGINEXPLUATATION\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| YEARS\_BUILD\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| COMMONAREA\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| ELEVATORS\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| ENTRANCES\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMAX\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| FLOORSMIN\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| LANDAREA\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAPARTMENTS\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| LIVINGAREA\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAPARTMENTS\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| NONLIVINGAREA\_MEDI | RealNumber | Keep unchanged at the moment, maybe clip later |
| FONDKAPREMONT\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| HOUSETYPE\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| TOTALAREA\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| WALLSMATERIAL\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| EMERGENCYSTATE\_MODE | RealNumber | Keep unchanged at the moment, maybe clip later |
| OBS\_30\_CNT\_SOCIAL\_CIRCLE | RealNumber | Clip to 5 |
| DEF\_30\_CNT\_SOCIAL\_CIRCLE | RealNumber | Not included in features |
| OBS\_60\_CNT\_SOCIAL\_CIRCLE | RealNumber | Clip to 5 |
| DEF\_60\_CNT\_SOCIAL\_CIRCLE | RealNumber | Not included in features |
| DAYS\_LAST\_PHONE\_CHANGE | Category | This should be converted to years, then converted to bucketized\_Column (From 0 to 60) |
| FLAG\_DOCUMENT\_2 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_3 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_4 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_5 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_6 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_7 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_8 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_9 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_10 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_11 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_12 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_13 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_14 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_15 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_16 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_17 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_18 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_19 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_20 | Category | This needs to be changed to Category |
| FLAG\_DOCUMENT\_21 | Category | This needs to be changed to Category |
| AMT\_REQ\_CREDIT\_BUREAU\_HOUR | Real Number | Don’t use this column |
| AMT\_REQ\_CREDIT\_BUREAU\_DAY | Real Number | Don’t use this column |
| AMT\_REQ\_CREDIT\_BUREAU\_WEEK | Real Number | Don’t use this column |
| AMT\_REQ\_CREDIT\_BUREAU\_MON | Real Number | Don’t use this column |
| AMT\_REQ\_CREDIT\_BUREAU\_QRT | Real Number | Don’t use this column |
| AMT\_REQ\_CREDIT\_BUREAU\_YEAR | Real Number | Clip to 7.5 |
| CREDIT\_DAY\_OVERDUE | Real Number | From Bureau |
| AMT\_CREDIT\_MAX\_OVERDUE | Real Number | From Bureau |
| CNT\_CREDIT\_PROLONG | Real Number | From Bureau |

## Loading data

Load all data from file application\_train.csv and below columns from bureau.csv:

* "SK\_ID\_CURR"
* "CREDIT\_DAY\_OVERDUE"
* "AMT\_CREDIT\_MAX\_OVERDUE"
* "CNT\_CREDIT\_PROLONG"
* "SK\_ID\_BUREAU"

## Split data into training and test datasets

Traing:testing=0.8:0.2

## Duplicates

No duplicates in table application\_train.csv.

## Clipping out outliers

Use below principle to clip outliers:

The max value is Q3+1.5\*(Q3-Q1)

## Imputation of Missing values

Use below principle to impute missing values:

For categorical null values, impute ‘NA’.

For real number null values, impute mean.

## Change Categorical data to one-Hot-Encoding

## Scaling

Use sklearn.preprocessing.StandardScaler to scale the real numbers.

## PCA Feature reduction

Reduce to 231 dimensions.

## Oversampling

Oversampling to keep data balanced.

## npscaling

Scaling again after pca.

# Modelling/Evaluation/Refinement

Note: The metrics are ROC\_AUC scores.