## German Credit Data Exploration\_3

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3/26/2018

## 1. Import the Clean data

```
We already have a clean file "german_credit_full.csv" to import.
credit_dataset <- read.csv("german_credit_full.csv",stringsAsFactors = TRUE)</pre>
str(credit_dataset)
## 'data.frame':
                    1000 obs. of 21 variables:
## $ Class
                               : Factor w/ 2 levels "Bad", "Good": 2 1 2 2 1 2 2 2 1 ...
## $ CheckingAccountStatus : Factor w/ 4 levels "0.to.200", "gt.200", ...: 3 1 4 3 3 4 4 1 4 1 ...
## $ Duration
                             : int 6 48 12 42 24 36 24 36 12 30 ...
## $ CreditHistory
                              : Factor w/ 5 levels "Critical", "Delay", ..: 1 4 1 4 2 4 4 4 4 1 ...
## $ Purpose
                              : Factor w/ 10 levels "Business", "DomesticAppliance",..: 7 7 3 4 5 3 4 1
                              : int 1169 5951 2096 7882 4870 9055 2835 6948 3059 5234 ...
## $ Amount
## $ SavingsAccountBonds
                              : Factor w/ 5 levels "100.to.500", "500.to.1000", ...: 5 4 4 4 4 5 2 4 3 4
                               : Factor w/ 5 levels "0.to.1", "1.to.4", ...: 4 2 3 3 2 2 4 2 3 5 ...
## $ EmploymentDuration
## $ InstallmentRatePercentage: int 4 2 2 2 3 2 3 2 2 4 ...
## $ Personal
                              : Factor w/ 4 levels "Female.NotSingle",..: 4 1 4 4 4 4 4 2 3 ...
## $ OtherDebtorsGuarantors : Factor w/ 3 levels "CoApplicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ ResidenceDuration
                              : int 4234444242...
                              : Factor w/ 4 levels "CarOther", "Insurance", ...: 3 3 3 2 4 4 2 1 3 1 ...
## $ Property
## $ Age
                              : int 67 22 49 45 53 35 53 35 61 28 ...
## $ OtherInstallmentPlans
                              : Factor w/ 3 levels "Bank", "None", ...: 2 2 2 2 2 2 2 2 2 2 ...
## $ Housing
                               : Factor w/ 3 levels "ForFree", "Own", ...: 2 2 2 1 1 1 2 3 2 2 ...
## $ NumberExistingCredits
                              : int 2 1 1 1 2 1 1 1 1 2 ...
                               : Factor w/ 4 levels "Management.SelfEmp.HighlyQualified",..: 2 2 4 2 2
## $ NumberPeopleMaintenance : int 1 1 2 2 2 2 1 1 1 1 ...
                               : int 1000010100...
## $ Telephone
## $ ForeignWorker
                               : int 1 1 1 1 1 1 1 1 1 ...
credit_dataset$Duration <- cut(credit_dataset$Duration, c(0,6,12,18,24,30,36,42,48,54,60,66,72,78),labe
credit_dataset$Amount <- cut(credit_dataset$Amount, c(0,25,30,35,40,50,60,70,80),labels = c("0.to.25","</pre>
credit_dataset$Age <- cut(credit_dataset$Age, c(0,6,12,18,24,30,36,42,48,54,60,66,72,78),labels = c("0."
credit_dataset$InstallmentRatePercentage <- as.factor(credit_dataset$InstallmentRatePercentage)</pre>
credit_dataset$ResidenceDuration <- as.factor(credit_dataset$ResidenceDuration)</pre>
credit_dataset$NumberExistingCredits <- as.factor(credit_dataset$NumberExistingCredits)</pre>
credit_dataset$InstallmentRatePercentage <- as.factor(credit_dataset$InstallmentRatePercentage)</pre>
Save everything to a csv file, so that it is reusable
save(credit_dataset, file = 'credit_dataset')
write.csv(credit_dataset, 'credit_dataset.csv',
          row.names = FALSE)
str(credit_dataset)
```

1000 obs. of 21 variables:

## 'data.frame':

```
## $ Class
                               : Factor w/ 2 levels "Bad", "Good": 2 1 2 2 1 2 2 2 1 ...
                               : Factor w/ 4 levels "0.to.200", "gt.200", ...: 3 1 4 3 3 4 4 1 4 1 ...
## $ CheckingAccountStatus
## $ Duration
                               : Factor w/ 13 levels "0.to.6", "6.to.12", ...: 1 8 2 7 4 6 4 6 2 5 ...
                               : Factor w/ 5 levels "Critical", "Delay",..: 1 4 1 4 2 4 4 4 1 ...
## $ CreditHistory
## $ Purpose
                               : Factor w/ 10 levels "Business", "DomesticAppliance", ...: 7 7 3 4 5 3 4 1
## $ Amount
                               : Factor w/ 8 levels "0.to.25", "25.to.30",...: NA NA NA NA NA NA NA NA NA NA
                               : Factor w/ 5 levels "100.to.500", "500.to.1000", ...: 5 4 4 4 4 5 2 4 3 4
## $ SavingsAccountBonds
                               : Factor w/ 5 levels "0.to.1", "1.to.4", ...: 4 2 3 3 2 2 4 2 3 5 ...
## $ EmploymentDuration
## $ InstallmentRatePercentage: Factor w/ 4 levels "1","2","3","4": 4 2 2 2 3 2 3 2 2 4 ...
## $ Personal
                               : Factor w/ 4 levels "Female.NotSingle",..: 4 1 4 4 4 4 4 4 2 3 ...
## $ OtherDebtorsGuarantors
                               : Factor w/ 3 levels "CoApplicant",..: 3 3 3 2 3 3 3 3 3 ...
## $ ResidenceDuration
                              : Factor w/ 4 levels "1","2","3","4": 4 2 3 4 4 4 4 2 4 2 ...
## $ Property
                              : Factor w/ 4 levels "CarOther", "Insurance", ...: 3 3 3 2 4 4 2 1 3 1 ...
                               : Factor w/ 13 levels "0.to.6", "6.to.12", ...: 12 4 9 8 9 6 9 6 11 5 ...
## $ Age
## $ OtherInstallmentPlans
                              : Factor w/ 3 levels "Bank", "None", ...: 2 2 2 2 2 2 2 2 2 2 ...
                               : Factor w/ 3 levels "ForFree", "Own", \ldots 2 2 2 1 1 1 2 3 2 2 \ldots
## $ Housing
## $ NumberExistingCredits
                               : Factor w/ 4 levels "1", "2", "3", "4": 2 1 1 1 2 1 1 1 1 2 ...
## $ Job
                               : Factor w/ 4 levels "Management.SelfEmp.HighlyQualified",..: 2 2 4 2 2
## $ NumberPeopleMaintenance : int 1 1 2 2 2 2 1 1 1 1 ...
## $ Telephone
                              : int 1000010100...
## $ ForeignWorker
                              : int 111111111...
```

## Let's prepare the data for modelling

- Make it all numerical data
- Pivot all categorical data such that each category reprsents a column

```
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
##
      filter, lag
## The following objects are masked from 'package:base':
##
##
      intersect, setdiff, setequal, union
library(dummies)
## dummies-1.5.6 provided by Decision Patterns
credit_dataset_withoutclass <- credit_dataset %>% select(c(-Class))
ml_credit_dataset <- dummy.data.frame(credit_dataset_withoutclass, sep = ".")</pre>
ml_credit_dataset$Class <- credit_dataset$Class</pre>
str(ml_credit_dataset)
## 'data.frame':
                  1000 obs. of 87 variables:
## $ CheckingAccountStatus.0.to.200 : int 0 1 0 0 0 0 1 0 1 ...
## $ CheckingAccountStatus.gt.200
                                        : int 0000000000...
## $ CheckingAccountStatus.lt.0
                                         : int
                                                1 0 0 1 1 0 0 0 0 0 ...
## $ CheckingAccountStatus.none
                                         : int 0010011010...
## $ Duration.O.to.6
                                         : int 1000000000...
## $ Duration.6.to.12
                                         : int 001000010...
```

```
$ Duration.12.to.18
                                                    0 0 0 0 0 0 0 0 0 0 ...
    $ Duration.18.to.24
                                                    0 0 0 0 1 0 1 0 0 0 ...
                                             : int
##
    $ Duration.24.to.30
                                                    0 0 0 0 0 0 0 0 0 1 ...
                                                    0 0 0 0 0 1 0 1 0 0 ...
##
    $ Duration.30.to.36
                                             : int
##
    $ Duration.36.to.42
                                                    0 0 0 1 0 0 0 0 0 0 ...
    $ Duration.42.to.48
                                                    0 1 0 0 0 0 0 0 0 0 ...
##
                                             : int
    $ Duration.48.to.54
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                             : int
    $ Duration.54.to.60
##
                                             : int
                                                    0 0 0 0 0 0 0 0 0 0 ...
##
    $ Duration.66.to.72
                                             : int
                                                    0 0 0 0 0 0 0 0 0 0 ...
##
    $ CreditHistory.Critical
                                             : int
                                                    1 0 1 0 0 0 0 0 0 1 ...
    $ CreditHistory.Delay
                                             : int
                                                    0 0 0 0 1 0 0 0 0 0 ...
##
    $ CreditHistory.NoCredit.AllPaid
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                               int
##
    $ CreditHistory.PaidDuly
                                                    0 1 0 1 0 1 1 1 1 0 ...
                                               int
    $ CreditHistory.ThisBank.AllPaid
##
                                             : int
                                                    0 0 0 0 0 0 0 0 0 0 ...
##
                                                    0 0 0 0 0 0 0 0 0 0 ...
    $ Purpose.Business
                                             : int
##
    $ Purpose.DomesticAppliance
                                               int
                                                    0 0 0 0 0 0 0 0 0 0 ...
##
                                                    0 0 1 0 0 1 0 0 0 0 ...
    $ Purpose.Education
                                             : int
##
    $ Purpose.Furniture.Equipment
                                                    0 0 0 1 0 0 1 0 0 0 ...
##
                                                    0 0 0 0 1 0 0 0 0 1 ...
    $ Purpose.NewCar
                                             : int
##
    $ Purpose.Others
                                             : int
                                                    0 0 0 0 0 0 0 0 0 0 ...
##
    $ Purpose.Radio.Television
                                             : int
                                                    1 1 0 0 0 0 0 0 1 0 ...
    $ Purpose.Repairs
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                             : int
##
                                                    0 0 0 0 0 0 0 0 0 0 ...
    $ Purpose.Retraining
                                             : int
    $ Purpose.UsedCar
                                                    0 0 0 0 0 0 0 1 0 0 ...
##
                                             : int
    $ SavingsAccountBonds.100.to.500
##
                                             : int
                                                    0 0 0 0 0 0 0 0 0 0 ...
    $ SavingsAccountBonds.500.to.1000
                                             : int
                                                    0 0 0 0 0 0 1 0 0 0 ...
##
    $ SavingsAccountBonds.gt.1000
                                                    0 0 0 0 0 0 0 0 1 0 ...
                                             : int
##
    $ SavingsAccountBonds.lt.100
                                             : int
                                                    0 1 1 1 1 0 0 1 0 1 ...
##
    $ SavingsAccountBonds.Unknown
                                                    1 0 0 0 0 1 0 0 0 0 ...
                                             : int
##
    $ EmploymentDuration.0.to.1
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                             : int
##
    $ EmploymentDuration.1.to.4
                                             : int
                                                    0 1 0 0 1 1 0 1 0 0 ...
##
    $ EmploymentDuration.4.to.7
                                             : int.
                                                    0 0 1 1 0 0 0 0 1 0 ...
##
    $ EmploymentDuration.gt.7
                                             : int
                                                    1 0 0 0 0 0 1 0 0 0 ...
                                                    0 0 0 0 0 0 0 0 0 1 ...
##
    $ EmploymentDuration.Unemployed
                                             : int
##
    $ InstallmentRatePercentage.1
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                               int
    $ InstallmentRatePercentage.2
##
                                                    0 1 1 1 0 1 0 1 1 0 ...
                                             : int
##
    $ InstallmentRatePercentage.3
                                                    0 0 0 0 1 0 1 0 0 0 ...
##
    $ InstallmentRatePercentage.4
                                             : int
                                                    1 0 0 0 0 0 0 0 0 1 ...
    $ Personal.Female.NotSingle
                                                    0 1 0 0 0 0 0 0 0 0 ...
                                             : int
##
    $ Personal.Male.Divorced.Seperated
                                                    0 0 0 0 0 0 0 0 1 0 ...
                                             : int
    $ Personal.Male.Married.Widowed
                                             : int
                                                    0 0 0 0 0 0 0 0 0 1 ...
##
    $ Personal.Male.Single
                                                    1 0 1 1 1 1 1 1 0 0 ...
                                             : int
##
    $ OtherDebtorsGuarantors.CoApplicant
                                               int
                                                    0 0 0 0 0 0 0 0 0 0 ...
    $ OtherDebtorsGuarantors.Guarantor
##
                                                    0 0 0 1 0 0 0 0 0 0 ...
                                               int
    $ OtherDebtorsGuarantors.None
                                             : int
                                                    1 1 1 0 1 1 1 1 1 1 ...
##
    $ ResidenceDuration.1
                                                    0 0 0 0 0 0 0 0 0 0 ...
                                             : int
##
    $ ResidenceDuration.2
                                             : int
                                                    0 1 0 0 0 0 0 1 0 1 ...
##
    $ ResidenceDuration.3
                                             : int
                                                    0 0 1 0 0 0 0 0 0 0 ...
##
    $ ResidenceDuration.4
                                             : int
                                                    1 0 0 1 1 1 1 0 1 0 ...
##
    $ Property.CarOther
                                               int
                                                    0 0 0 0 0 0 0 1 0 1 ...
##
                                                    0 0 0 1 0 0 1 0 0 0 ...
    $ Property.Insurance
                                             : int
##
   $ Property.RealEstate
                                             : int
                                                    1 1 1 0 0 0 0 0 1 0 ...
    $ Property.Unknown
                                             : int
                                                    0 0 0 0 1 1 0 0 0 0 ...
    $ Age.18.to.24
                                             : int 0 1 0 0 0 0 0 0 0 0 ...
```

```
$ Age.24.to.30
                                         : int 000000001...
## $ Age.30.to.36
                                         : int 0000010100...
## $ Age.36.to.42
                                               0000000000...
                                         : int 0001000000...
## $ Age.42.to.48
## $ Age.48.to.54
                                                0 0 1 0 1 0 1 0 0 0 ...
## $ Age.54.to.60
                                                0 0 0 0 0 0 0 0 0 0 ...
                                         : int
## $ Age.60.to.66
                                                0 0 0 0 0 0 0 0 1 0 ...
                                         : int
                                                1 0 0 0 0 0 0 0 0 0 ...
## $ Age.66.to.72
                                         : int
##
   $ Age.72.to.78
                                         : int
                                                0 0 0 0 0 0 0 0 0 0 ...
## $ OtherInstallmentPlans.Bank
                                                0 0 0 0 0 0 0 0 0 0 ...
                                         : int
## $ OtherInstallmentPlans.None
                                         : int 1 1 1 1 1 1 1 1 1 1 ...
## $ OtherInstallmentPlans.Stores
                                                0 0 0 0 0 0 0 0 0 0 ...
                                         : int
                                         : int 0001110000...
## $ Housing.ForFree
## $ Housing.Own
                                         : int 1 1 1 0 0 0 1 0 1 1 ...
## $ Housing.Rent
                                         : int
                                                0 0 0 0 0 0 0 1 0 0 ...
## $ NumberExistingCredits.1
                                         : int
                                                0 1 1 1 0 1 1 1 1 0 ...
## $ NumberExistingCredits.2
                                         : int 100010001...
## $ NumberExistingCredits.3
                                         : int 0000000000...
## $ NumberExistingCredits.4
                                                0 0 0 0 0 0 0 0 0 0 ...
                                         : int
## $ Job.Management.SelfEmp.HighlyQualified: int
                                                0 0 0 0 0 0 0 1 0 1 ...
## $ Job.SkilledEmployee
                                        : int
                                                1 1 0 1 1 0 1 0 0 0 ...
## $ Job.UnemployedUnskilled
                                                0 0 0 0 0 0 0 0 0 0 ...
                                         : int
## $ Job.UnskilledResident
                                         : int
                                                0 0 1 0 0 1 0 0 1 0 ...
   $ NumberPeopleMaintenance
                                         : int 1122221111...
## $ Telephone
                                         : int 1000010100...
## $ ForeignWorker
                                         : int 1 1 1 1 1 1 1 1 1 1 ...
## $ Class
                                         : Factor w/ 2 levels "Bad", "Good": 2 1 2 2 1 2 2 2 1 ...
   - attr(*, "dummies")=List of 16
##
    ..$ CheckingAccountStatus
                              : int 1234
    ..$ Duration
                                : int 5 6 7 8 9 10 11 12 13 14 ...
                                      16 17 18 19 20
##
    ..$ CreditHistory
                                : int
##
    ..$ Purpose
                                : int
                                      21 22 23 24 25 26 27 28 29 30
    ..$ SavingsAccountBonds
##
                                : int
                                      31 32 33 34 35
##
    ..$ EmploymentDuration
                                : int 36 37 38 39 40
##
    ..$ InstallmentRatePercentage: int 41 42 43 44
##
    ..$ Personal
                                : int 45 46 47 48
##
    ..$ OtherDebtorsGuarantors : int 49 50 51
##
    ..$ ResidenceDuration
                                : int 52 53 54 55
##
    ..$ Property
                                : int
                                      56 57 58 59
##
    ..$ Age
                                : int 60 61 62 63 64 65 66 67 68 69
##
    ..$ OtherInstallmentPlans
                                : int 70 71 72
                                : int 73 74 75
##
    ..$ Housing
    ..$ NumberExistingCredits
                                : int 76 77 78 79
##
    ..$ Job
                                : int 80 81 82 83
save(ml_credit_dataset, file = 'ml_credit_dataset')
write.csv(ml_credit_dataset, 'ml_credit_dataset.csv',
         row.names = FALSE)
```