Assignment 1

Nikola Metes

Set up environment

```
# library(caret)
library("Hmisc")
## Loading required package: lattice
## Loading required package: survival
## Loading required package: Formula
## Loading required package: ggplot2
##
## Attaching package: 'Hmisc'
## The following objects are masked from 'package:base':
##
##
       format.pval, units
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:Hmisc':
##
##
       src, summarize
## The following objects are masked from 'package:stats':
##
##
       filter, lag
## The following objects are masked from 'package:base':
       intersect, setdiff, setequal, union
##
library(ggplot2)
Data<-file.path("Data")</pre>
```

d<-read.csv(file.path(Data, "GermanCredit.csv")) head(d)</pre>

```
Duration Amount InstallmentRatePercentage ResidenceDuration Age
##
## 1
            6
                 1169
                                                4
                                                                      67
## 2
           48
               5951
                                               2
                                                                      22
                                                                   3 49
## 3
           12
               2096
                                               2
## 4
           42
                7882
                                                2
                                                                      45
## 5
           24
                4870
                                                3
                                                                      53
## 6
           36
                9055
                                                2
##
     NumberExistingCredits NumberPeopleMaintenance Telephone ForeignWorker
## 1
                          2
                                                    1
## 2
                          1
                                                    1
                                                              1
                                                                              1
## 3
                          1
                                                    2
                                                               1
                                                                              1
## 4
                                                    2
                          1
                                                               1
                                                                              1
## 5
                                                    2
                                                               1
                                                                              1
## 6
                          1
                                                               0
                                                                              1
     Class CheckingAccountStatus.lt.0 CheckingAccountStatus.0.to.200
## 1 Good
                                      1
## 2
       Bad
                                      0
                                                                       1
## 3 Good
                                      0
                                                                       0
## 4
      Good
                                      1
                                                                       0
## 5
       Bad
                                                                       0
                                      1
## 6
     Good
                                      0
                                                                       0
     CheckingAccountStatus.gt.200 CheckingAccountStatus.none
## 1
                                  0
## 2
                                  0
                                                               0
## 3
                                                               1
                                  0
## 4
                                  0
                                                               0
## 5
                                  0
## 6
                                  0
     CreditHistory.NoCredit.AllPaid CreditHistory.ThisBank.AllPaid
                                    0
## 2
                                    0
                                                                     0
## 3
                                    0
                                                                     0
## 4
                                    0
                                                                     0
## 5
                                    0
                                    0
## 6
     CreditHistory.PaidDuly CreditHistory.Delay CreditHistory.Critical
## 2
                                                 0
                                                                         0
                           1
## 3
                           0
                                                                         1
## 4
                           1
                                                 0
                                                                         0
                           0
                                                                         0
                                                 1
## 6
                                                 0
                           1
     Purpose.NewCar Purpose.UsedCar Purpose.Furniture.Equipment
## 1
                   0
                                    0
## 2
                   0
                                                                  0
                                                                  0
## 3
                   0
                                    0
## 4
                   0
                                    0
                                                                  1
## 5
                                                                  0
                   1
                   0
                                    0
## 6
    Purpose.Radio.Television Purpose.DomesticAppliance Purpose.Repairs
```

```
## 1
                                                           0
                                                                            0
## 2
                                                          0
                              1
                                                                            0
## 3
                              0
                                                           0
## 4
                                                           0
## 5
                                                           0
## 6
                              0
                                                          0
                                                                            0
     Purpose. Education Purpose. Vacation Purpose. Retraining Purpose. Business
## 1
                       0
                                                              0
                                         0
## 2
                       0
                                         0
                                                              0
                                                                                0
## 3
                       1
                                         0
                                                              0
                                                                                0
                                                                                0
## 5
                       0
                                         0
                                                              0
                                                                                0
## 6
                       1
                                         0
                                                              0
     Purpose.Other SavingsAccountBonds.lt.100 SavingsAccountBonds.100.to.500
## 1
                                                0
## 2
                  0
                                                1
                                                                                 0
## 3
                  0
                                                1
                                                                                 0
## 4
                                                                                 0
## 5
                                                                                 0
## 6
                  0
                                                                                 0
##
     SavingsAccountBonds.500.to.1000 SavingsAccountBonds.gt.1000
## 2
                                      0
                                                                    0
## 3
                                                                    0
## 4
                                                                    0
## 5
                                                                    0
## 6
                                      0
                                                                    0
     SavingsAccountBonds.Unknown EmploymentDuration.lt.1
## 1
                                 1
## 2
                                 0
                                                            0
## 3
                                 0
                                                            0
## 4
                                 0
                                                            0
## 5
## 6
                                 1
                                                            0
     EmploymentDuration.1.to.4 EmploymentDuration.4.to.7
##
## 1
                               0
## 2
                                                            0
## 3
                               0
                                                            1
## 4
## 5
                               1
## 6
                               1
     EmploymentDuration.gt.7 EmploymentDuration.Unemployed
##
## 1
                             1
## 2
                             0
                                                              0
## 3
                                                              0
                                                              0
## 4
                             0
## 5
                                                              0
## 6
     Personal.Male.Divorced.Seperated Personal.Female.NotSingle
## 1
                                       0
## 2
                                       0
                                                                   1
## 3
                                       0
                                                                   0
## 4
                                       0
                                                                   0
## 5
                                       0
                                                                   0
```

```
## 6
                                      0
                                                                  0
    Personal.Male.Single Personal.Male.Married.Widowed
## 2
                                                          0
## 3
                                                          0
## 4
                         1
                                                          0
## 5
## 6
                                                          0
     Personal.Female.Single OtherDebtorsGuarantors.None
## 1
                           0
## 2
## 3
                            0
                                                          1
                            0
## 5
                            0
                                                          1
## 6
                            0
                                                          1
     {\tt OtherDebtorsGuarantors.CoApplicant\ OtherDebtorsGuarantors.Guarantor}
## 1
                                         0
## 2
                                                                            0
## 3
                                                                            0
## 4
## 5
                                         0
                                                                            0
## 6
     Property.RealEstate Property.Insurance Property.CarOther
## 2
                                                                0
## 3
## 4
                        0
                                             1
                                                                0
## 5
                        0
## 6
                        0
                                             0
                                                                0
     Property.Unknown OtherInstallmentPlans.Bank OtherInstallmentPlans.Stores
## 1
                     0
## 2
                     0
                                                  0
                                                                                  0
## 3
                     0
                                                                                  0
                     0
                                                  0
## 4
                                                                                  0
## 5
                                                  0
                     1
                                                                                  0
## 6
                                                  0
                     1
     OtherInstallmentPlans.None Housing.Rent Housing.Own Housing.ForFree
## 1
                                1
                                              0
                                                           1
## 2
                                              0
                                                                            0
## 3
                                              0
                                                           1
                                                                            0
                                1
## 4
                                              0
                                                           0
## 5
                                              0
                                                           0
## 6
                                1
                                              0
                                                           0
     Job.UnemployedUnskilled Job.UnskilledResident Job.SkilledEmployee
## 1
                             0
                                                    0
## 2
                             0
                                                    0
                                                                          1
## 3
                             0
                                                    1
## 4
                             0
                                                    0
## 5
                                                    0
                                                                          1
## 6
                            0
     Job.Management.SelfEmp.HighlyQualified
## 1
## 2
                                             0
## 3
                                             0
```

```
## 5
                                            0
## 6
                                            0
d1<-read.csv(file.path(Data, "GermanCredit_modified_SP19_001.csv"))</pre>
     Duration Amount InstallmentRatePercentage ResidenceDuration Age
##
                1169
## 2
           48
                5951
                                               2
                                                                     22
## 3
                2096
                                               2
           12
                                                                  3
                                                                     49
                7882
                                               2
## 4
           42
                                                                    45
                4870
                                               3
## 5
           24
                                                                  4 53
                9055
                                               2
## 6
           36
                                                                  4 35
     NumberExistingCredits NumberPeopleMaintenance Telephone ForeignWorker
                                                   1
## 2
                          1
                                                   1
                                                                            1
                                                             1
## 3
                          1
                                                   2
                                                                            1
## 4
                                                   2
                          1
                                                             1
                                                                            1
## 5
                                                   2
                                                                            1
## 6
                                                   2
                          1
                                                                            1
     Class Checking Credit. History
                                        Loan.Purpose Savings
## 1 Good
               lt.0
                          Critical Radio.Television Unknown
## 2
                           PaidDuly Radio.Television lt.100
       Bad 0.to.200
                                            Education lt.100
## 3
      Good
               None
                           Critical
## 4
      Good
               lt.0
                           PaidDuly
                                            Furniture lt.100
## 5
                                               NewCar lt.100
       Bad
               lt.0
                              Delay
                                            Education Unknown
                          PaidDuly
      Good
               None
##
     Employment.Duration Personal.Status Other.Debtors
                                                           Property
## 1
                    gt.7
                                   Single
                                                    None RealEstate
## 2
                  1.to.4
                                NotSingle
                                                    None RealEstate
## 3
                  4.to.7
                                   Single
                                                    None RealEstate
## 4
                  4.to.7
                                   Single
                                               Guarantor Insurance
## 5
                                   Single
                                                    None
                                                            Unknown
                  1.to.4
## 6
                  1.to.4
                                   Single
                                                    None
                                                            Unknown
##
     OtherInstallmentPlans Housing
                                              Job. Type
## 1
                      None
                                      SkilledEmployee
## 2
                      None
                                      SkilledEmployee
                                Own
## 3
                      None
                                Own UnskilledResident
## 4
                      None ForFree
                                      SkilledEmployee
                      None ForFree
## 5
                                      SkilledEmployee
## 6
                       None ForFree UnskilledResident
Hmisc::describe(d)
## d
##
                        1000 Observations
    62 Variables
## Duration
##
          n missing distinct
                                   Info
                                             Mean
                                                       Gmd
                                                                 .05
                                                                          .10
##
       1000
                            33
                                  0.985
                                             20.9
                                                     12.98
                                                                            9
                   0
##
        .25
                           .75
                                    .90
                                              .95
                  .50
```

0

4

```
12 18 24
##
                     36 48
##
## lowest : 4 5 6 7 8, highest: 47 48 54 60 72
## -----
## Amount
    n missing distinct Info Mean
                               Gmd .05
                                          .10
    1000 0 921
                    1
                         3271
                               2773
                                    709
                                          932
         .50 .75
                    .90
##
    . 25
                         .95
        2320 3972
##
    1366
                    7179
                         9163
##
## lowest: 250 276 338 339 343, highest: 15653 15672 15857 15945 18424
## -----
## InstallmentRatePercentage
  n missing distinct Info Mean
                               Gmd
##
    1000 0
              4
                   0.873
                         2.973
                               1.2
##
       1
## Value
             2 3
## Frequency 136 231 157
                   476
## Proportion 0.136 0.231 0.157 0.476
## ------
## ResidenceDuration
  n missing distinct Info
                        Mean
    1000 0 4 0.895
##
                         2.845
                              1.205
##
## Value 1
              2 3
## Frequency 130 308 149 413
## Proportion 0.130 0.308 0.149 0.413
## Age
                                    .05
    n missing distinct Info Mean Gmd
                                          .10
       0 53
##
    1000
                   0.999
                         35.55
                              12.41
                                    22
                                          23
    .25
                        .95
              .75 .90
##
          .50
         33
##
     27
               42
                     52
                          60
##
## lowest : 19 20 21 22 23, highest: 67 68 70 74 75
## ------
## NumberExistingCredits
##
   n missing distinct Info
                              Gmd
                        Mean
    1000 0 4
##
                   0.709
                         1.407 0.5428
##
## Value 1 2 3
## Frequency 633 333
                 28
## Proportion 0.633 0.333 0.028 0.006
## -----
## NumberPeopleMaintenance
  n missing distinct Info Mean Gmd
    1000 0 2
                   0.393
##
                         1.155 0.2622
##
       1
## Value
              2
## Frequency 845
            155
## Proportion 0.845 0.155
## -----
## Telephone
## n missing distinct Info Sum Mean Gmd
```

##	1000	0	2	0.722	596	0.596	0.4821	
##								
	ForeignWo							
##	_		distinct	Info	Sum	Mean	Gmd	
##	1000	0			963	0.963	0.07133	
##								
##								
##	Class	missing	distinct					
##	1000	0	2					
##								
		Bad Go						
	Frequency							
	Proportio							
			atus.lt.0					
##	_		distinct		Sum	Mean	Gmd	
##	1000	0	2	0.597	274	0.274	0.3982	
##								
##	Chaplein mA			200				
##	_		atus.0.to. distinct	200 Info	Sum	Mean	Gmd	
##	1000	0	2	0.59				
##								
##								
	_		atus.gt.20		C	M	C 3	
##	n 1000	missing 0	distinct 2	0.177	Sum 63	Mean 0.063	Gmd 0.1182	
##	1000	O	2	0.177	00	0.000	0.1102	
##								
##	CheckingA							
##		J	distinct		Sum	Mean	Gmd	
##	1000	0	2	0.716	394	0.394	0.478	
##								
	CreditHis	tory.NoCı	redit.AllP	aid				
##			distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.115	40	0.04	0.07688	
##								
##			sBank.AllP					
##		•	distinct	Info	Sum	Mean	Gmd	
##	1000	0		0.14	49	0.049		
##								
##								
##	CreditHis	•	dDuly distinct	Info	Sum	Mean	Gmd	
##	1000	gnrasım O		0.747	530	0.53	0.4987	
##	1000	Ü	-	5.1.11	555	3.00	0.1001	
##								
	CreditHis	•	•					
##		_	distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.241	88	0.088	0.1607	

(creditHis	tory.Crit	 tical					
		•	distinct					
	2000	·	2	0.022	293	0.293	0.4147	
	ourpose.N							
		•	distinct		Sum	Mean		
			2		234	0.234	0.3588	
I	ourpose.U							
	n	missing	distinct	Info	Sum	Mean	Gmd	
			2	0.277	103	0.103	0.185	
F			 .Equipment					
			distinct	Info	Sum	Mean	Gmd	
			2	0.445	181	0.181	0.2968	
I	ourpose.R	adio.Tele	evision					
			distinct			Mean		
_	1000		2	0.605	280	0.28	0.4036	
Ε	Purpose.D	omesticAp	ppliance					
			distinct		Sum	Mean		
	1000		2	0.036	12	0.012	0.02374	
I	ourpose.R							
		missing	distinct	Info	Sum	Mean	Gmd	
	1000	0	2	0.065	22	0.022	0.04308	
F	ourpose.E	ducation						
		_	distinct					
			2				0.0951	
	Purpose.V							
			distinct					
	1000	0	1	0	0	0		
	/alue	0						
	requency							
-	roportio							
F	Purpose.R n	-	g distinct	Info	Sum	Mean	Gmd	
		_	2		9		0.01786	

#								
#	Purpose.B	usiness						
‡	n	missing	distinct	Info	Sum	Mean	Gmd	
ŧ	1000	0	2	0.263	97	0.097	0.1754	
ŧ								
ŧ								
ŧ	Purpose.0	ther						
‡	n	missing	distinct	Info	Sum	Mean	Gmd	
#	1000	0	2	0.036	12	0.012	0.02374	
#								
	_		ls.lt.100		~			
#		•	distinct		Sum		Gmd	
#	1000	0	2	0.718	603	0.603	0.4793	
#								
#								
	_		ls.100.to.		C	M	C3	
#		missing 0	distinct 2	Info 0.277			Gmd 0.185	
# #	1000	U	2	0.211	103	0.103	0.165	
		countRone	ls.500.to.:	1000				
₩ #	_	missing		Info	Sum	Mean	Gmd	
#	1000	0	2	0.177	63	0.063		
#	1000	· ·	_	0.111	00	0.000	0.1102	
#								
#	SavingsAc	countBond	ds.gt.1000					
#	n	missing	distinct	Info	Sum	Mean	Gmd	
#	1000	0	2	0.137	48	0.048	0.09148	
#								
#								
	_		ls.Unknown					
#		missing	distinct	Info	$\operatorname{\mathtt{Sum}}$	Mean	Gmd	
#	1000	0	2	0.449	183	0.183	0.2993	
#								
#								
	Employmen			T 6	a		<i>a</i> 1	
#		missing		Info	Sum	Mean	Gmd	
#	1000	0	2	0.427	172	0.172	0.2851	
#								
#	Employmen	+Dura+ia-	1 +0 4					
# #	Employmen n		distinct	Info	Sum	Mean	Gmd	
#	1000	gnraarm 0	2	0.672	339	0.339	0.4486	
₩ #	1000	O	4	0.012	505	0.000	0.1400	
#								
	Employmen	tDuration	1.4.to.7					
#	n		distinct	Info	Sum	Mean	Gmd	
#	1000	0	2	0.431	174	0.174	0.2877	
#			_		. =		- • •	
#								
#	Employmen	tDuration	n.gt.7					
#	n		distinct	Info	Sum	Mean	Gmd	
#	1000	0	2	0.567	253	0.253	0.3784	

Emplormo-	_						
		n.Unemploye		~			
	•	distinct	Info	Sum	Mean	Gmd	
1000	0	2	0.174	62	0.062	0.1164	
		orced.Sepe					
n	missing	distinct	Info	Sum	Mean	Gmd	
1000	0	2	0.143	50	0.05	0.0951	
 Personal.		 otSingle					
		distinct	Info	Sum	Mean	Gmd	
1000	0	2	0.642	310	0.31	0.4282	
 Personal.		 gle					
		distinct	Info	Sum	Mean	Gmd	
1000	0	2	0.743	548	0.548	0.4959	
		ried.Widow					
	•	distinct		Sum	Mean	Gmd	
1000	0	2	0.251	92	0.092	0.1672	
Personal.	Female.S	ingle					
	•	distinct		Mean	Gmd		
1000	0	1	0	0	0		
Value	0						
Frequency Proportio							
		ntors.None		-		<u>.</u> -	
n	missing	distinct	Info	Sum	Mean	Gmd	
n 1000	missing 0	distinct 2	0.253	907	0.907	0.1689	
n 1000 OtherDebt	missing 0 	distinct 2 ntors.CoApp	0.253 plicant	907	0.907	0.1689	
n 1000 OtherDebt	missing 0 orsGuaran missing	distinct 2 ntors.CoApp	0.253 plicant Info	907 Sum	0.907 Mean	0.1689 Gmd	
n 1000 OtherDebt n 1000	missing 0 orsGuaran missing 0	distinct 2 ntors.CoApp distinct 2	0.253 plicant Info 0.118	907 Sum 41	0.907 Mean	0.1689 Gmd	
n 1000 OtherDebt n 1000 OtherDebt	missing 0 corsGuaran missing 0 corsGuaran	distinct 2 ntors.CoApp distinct 2 ntors.Guara	0.253 clicant Info 0.118	907 Sum 41	0.907 Mean 0.041	0.1689 Gmd 0.07872	
n 1000 OtherDebt n 1000 OtherDebt	missing 0 corsGuaran missing 0 corsGuaran	distinct 2 ntors.CoApp distinct 2	0.253 clicant Info 0.118	907 Sum 41	0.907 Mean 0.041	0.1689 Gmd 0.07872	
n 1000 	missing 0 corsGuaran missing 0 corsGuaran missing 0	distinct 2 ntors.CoApp distinct 2 ntors.Guara distinct 2	0.253 colicant Info 0.118 contor Info 0.148	907Sum 41 Sum 52	0.907 Mean 0.041 Mean 0.052	0.1689 Gmd 0.07872	
n 1000 	missing 0 corsGuaran missing 0 corsGuaran missing 0 corsGuaran missing 0	distinct 2 ntors.CoApp distinct 2 ntors.Guara distinct 2	0.253 colicant Info 0.118 antor Info 0.148	907 Sum 41 Sum 52	0.907 Mean 0.041 Mean 0.052	Gmd 0.07872 Gmd 0.09869	

##								
##	Property.	Insurance	е					
##			distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.535	232	0.232	0.3567	
##								
##								
##	Property.	CarOther						
##			distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.665	332	0.332	0.444	
##								
##								
##	Property.	Unknown						
##	n	missing	distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.391	154	0.154	0.2608	
##								
##								
##	OtherInst	allmentP	lans.Bank					
##	n	missing	distinct	Info	Sum	Mean	Gmd	
##		_	2			0.139	0.2396	
##								
##								
##	OtherInst	allmentP	lans.Stores	3				
##			distinct		Sum	Mean	Gmd	
##		•	2					
##								
##								
##	OtherInst	allmentP	lans.None					
##			distinct		Sum	Mean	Gmd	
##		•	2			0.814	0.3031	
##								
##								
##	Housing.R	lent						
##	•		distinct	Info	Sum	Mean	Gmd	
##	1000	•		0.441		0.179	0.2942	
##								
##								
##	Housing.C)wn						
##			distinct	Info	Sum	Mean	Gmd	
##	1000	0	2	0.614	713	0.713	0.4097	
##								
##								
##	Housing.F	orFree						
##	•		distinct	Info	Sum	Mean	Gmd	
##	1000	0		0.289	108	0.108	0.1929	
##								
##								
##	Job.Unemp	loyedUns	killed					
##	-	•	distinct	Info	Sum	Mean	Gmd	
##	1000	0		0.065	22		0.04308	
##								
##								
##	Job.Unski	lledResi	dent					
##			distinct	Info	Sum	Mean	Gmd	
##	1000	0		0.48	200	0.2	0.3203	
		Ŭ	_					

```
##
##
   Job.SkilledEmployee
##
             missing distinct
                                    Info
                                               Sum
                                                        Mean
                                                                   Gmd
##
       1000
                                   0.699
                                               630
                                                        0.63
                                                               0.4667
##
   Job.Management.SelfEmp.HighlyQualified
##
          n missing distinct
                                               Sum
                                                        Mean
                                                                   Gmd
##
       1000
                                   0.378
                                               148
                                                       0.148
                                                               0.2524
##
de <- describe(d)
# p <- plot(d)
# plot(d, which='categorical')
```

Question 1.3.a

This data represents a collection of important variables that a certain financial institution might find important in their processing of financial loans. There are general factors that are mostly represented by numerical values and integers (apart from class) that allow us to

Question 1.3.b

In this data set we have 1000 observations and 62 different variables.

Question 1.3.c

There are 61 numerical variables.

They are the following: Duration, Amount, InstallmentRatePercentage; ResidenceDuration; Age; NumberExistingCredits; NumberPeopleMaintenance; Telephone; ForeignWorker; CheckingAccountStatus.0.to.200; CheckingAccountStatus.200; CheckingAccountStatus.none; CreditHistory.NoCredit.AllPaid; CreditHistory.ThisBank.AllPaid; CreditHistory.PaidDuly; CreditHistory.Delay; CreditHistory.Critical; Purpose.NewCar; Purpose.UsedCar; Purpose.Furniture.Equipment; Purpose.Radio.Television; Purpose.DomesticAppliance; Purpose.Repairs; Purpose.Education; Purpose.Vacation; Purpose.Retraining; Purpose.Business; Purpose.Other; SavingsAccountBonds.lt.100; SavingsAccountBonds.100.to.500; SavingsAccountBonds.500.to.1000; SavingsAccountBonds.gt.1000; SavingsAccountBonds.Unknown; EmploymentDuration.lt.1; EmploymentDuration.1.to.4; EmploymentDuration.4.to.7; EmploymentDuration.gt.7; EmploymentDuration.Unemployed; Personal.Male.Divorced.Seperated; Personal.Female.NotSingle; Personal.Male.Single; Personal.Male.Married.Widowed; Personal.Female.Single; OtherDebtorsGuarantors.None; OtherDebtorsGuarantors.CoApplicant; OtherDebtorsGuarantors.Guarantor; Property.RealEstate; Property.Insurance; Property.CarOther; Property.Unknown; OtherInstallment-Plans.Bank; OtherInstallmentPlans.Stores; OtherInstallmentPlans.None; Housing.Rent; Housing.Own; Housing.ForFree; Job.UnemployedUnskilled; Job.UnskilledResident; Job.SkilledEmployee; Job.Management.SelfEmp.HighlyGuarantors.Surplication.Scare.

They represent different numerical values for some (i.e. amount, duration, age), while others are binary (using 1 and 0) displaying if a certain individual has a variable (1) or doesn't have one (0).

Question 1.3.d

There is 1 categorical value. The only categorical value is Class. It measures the customers credit as being either Good or Bad.

Question 1.3.e

We can perform certain calculations and observe patterns and other trends with loan users. This can display different insights (i.e. who is applying for loans, at what age, what is their credit history, their current assets, if they are employed etc.)

```
d %>%
    ggplot(aes(x=Amount,y=Duration,color=factor(Housing.Own)))+
    geom_point()+
    geom_smooth(method="lm")
```

