```
> data<- read.csv("CleanCreditScoring.csv")</pre>
> dim(data)
[1] 4446
> summary(data)
                    Seniority
                                      Home
                                                        Time
   Status
                  Min. : 0.000
                                                    Min. : 6.00
Length:4446
                                  Length:4446
Class :character
                  1st Qu.: 2.000
                                  Class :character
                                                    1st Qu.:36.00
                  Median : 5.000
Mode :character
                                  Mode :character
                                                    Median :48.00
                  Mean : 7.991
                                                    Mean :46.45
                  3rd Ou.:12.000
                                                    3rd Ou.:60.00
                  Max. :48.000
                                                    Max. :72.00
                 Marital
                                   Records
                                                       Job
     Age
Min. :18.00
               Length:4446
                                 Length:4446
                                                   Length:4446
1st Qu.:28.00
               Class :character
                                 Class :character
                                                   Class :character
               Mode :character
                                                   Mode :character
                                 Mode :character
Median :36.00
Mean :37.08
3rd Qu.:45.00
Max. :68.00
   Expenses
                   Income
                                  Assets
                                                   Debt
                                                                   Amount
Min. : 35.0
               Min. : 1.0
                              Min. :
                                          0
                                              Min. :
                                                         0.0
                                                               Min. : 100
 1st Qu.: 35.0
               1st Qu.: 90.0
                              1st Qu.:
                                          0
                                              1st Qu.:
                                                         0.0
                                                               1st Qu.: 700
Median : 51.0
               Median :124.0
                              Median : 3000
                                              Median :
                                                         0.0
                                                               Median :1000
Mean : 55.6
               Mean :140.6
                              Mean : 5355
                                              Mean : 342.3
                                                               Mean :1039
                              3rd Qu.: 6000
                                                               3rd Qu.:1300
3rd Qu.: 72.0
               3rd Qu.:170.0
                                              3rd Qu.: 0.0
Max. :180.0
               Max. :959.0
                              Max. :300000
                                              Max. :30000.0
                                                               Max. :5000
                  Finrat
                                   Savings
                                               seniorityR
   Price
Min. : 105
               Min. : 6.702
                                Min. :-8.160
                                                Length:4446
1st Qu.: 1116
               1st Qu.: 60.030
                                1st Qu.: 1.615
                                                Class :character
Median : 1400
               Median : 77.097
                                Median : 3.120
                                                Mode :character
Mean : 1462
               Mean : 72.616
                                Mean : 3.860
                                3rd Qu.: 5.196
 3rd Qu.: 1692
               3rd Qu.: 88.460
                    :100.000
Max.
      :11140
               Max.
                                Max. :33.250
   timeR
                      ageR
                                     expensesR
                                                        incomeR
Length:4446
                  Length:4446
                                    Length:4446
                                                      Length:4446
Class :character Class :character Class :character
                                                      Class :character
Mode :character Mode :character Mode :character
                                                      Mode :character
  assetsR
                     debtR
                                      amountR
                                                         priceR
                  Length:4446
Length:4446
                                    Length:4446
                                                      Length:4446
                                    Class :character
Class :character
                  Class :character
                                                      Class :character
Mode :character
                  Mode :character
                                    Mode :character
                                                      Mode :character
  finratR
                    savingsR
 Length:4446
                  Length:4446
Class :character
                  Class :character
                  Mode :character
Mode :character
> str(data)
'data.frame':
              4446 obs. of 27 variables:
$ Status : chr "good" "good" "bad" "good" ...
 $ Seniority : int 9 17 10 0 0 1 29 9 0 0 ...
            : chr "rent" "rent" "owner" "rent" ...
$ Home
```

: int 60 60 36 60 36 60 60 12 60 48 ...

\$ Time

```
30 58 46 24 26 36 44 27 32 41 ...
 $ Age
              : int
                     "married" "widow" "married" "single" ...
 $ Marital
              : chr
                     "no_rec" "no_rec" "yes_rec" "no_rec" ...
 $ Records
              : chr
                     "freelance" "fixed" "freelance" "fixed" ...
              : chr
                     73 48 90 63 46 75 75 35 90 90 ...
 $ Expenses
             : int
                    129 131 200 182 107 214 125 80 107 80 ...
 $ Income
             : int
             : int 0 0 3000 2500 0 3500 10000 0 15000 0 ...
 $ Assets
             : int 0000000000...
 $ Debt
                     800 1000 2000 900 310 650 1600 200 1200 1200 ...
 $ Amount
             : int
 $ Price
             : int
                     846 1658 2985 1325 910 1645 1800 1093 1957 1468 ...
                     94.6 60.3 67 67.9 34.1 ...
 $ Finrat
             : num
 $ Savings : num
                     4.2 4.98 1.98 7.93 7.08 ..
 $ seniorityR: chr
                     "sen (8,14]" "sen (14,99]" "sen (8,14]" "sen (-1,1]" ...
                     "time (48,99]" "time (48,99]" "time (24,36]" "time (48,99]" ...
             : chr
 $ timeR
                     "age (25,30]" "age (50,99]" "age (40,50]" "age (0,25]" ...
 $ ageR
              : chr
                     "exp (60,80]" "exp (40,50]" "exp (80,1e+04]" "exp (60,80]" ...

"inc (110,140]" "inc (110,140]" "inc (190,1e+04]" "inc (140,190]" ...

"asset (-1,0]" "asset (-1,0]" "asset (0,3e+03]" "asset (0,3e+03]" ...
 $ expensesR : chr
 $ incomeR
             : chr
             : chr
 $ assetsR
                     "debt (-1,0]" "debt (-1,0]" "debt (-1,0]" "debt (-1,0]" ...
 $ debtR
             : chr
                     "am (600,900]" "am (900,1.1e+03]" "am (1.4e+03,1e+05]" "am (600,900]" ...
 $ amountR
             : chr
             : chr
                     "priz (0,1e+03]" "priz (1.5e+03,1.8e+03]" "priz (1.8e+03,1e+05]" "priz (
$ priceR
1.3e+03,1.5e+03]" ...
$ finratR : chr "finr (90,100]" "finr (50,70]" "finr (50,70]" "finr (50,70]" ...
 $ savingsR : chr "sav (4,6]" "sav (4,6]" "sav (0,2]" "sav (6,99]" ...
> mean(data$Amount)
[1] 1038.763
> median(data$Amount)
[1] 1000
> mode(data$Amount)
[1] "numeric"
> min(data$Amount)
[1] 100
> max(data$Amount)
[1] 5000
> quantile(data$Amount)
  0% 25% 50% 75% 100%
 100 700 1000 1300 5000
> mean(data$Income)
[1] 140.6298
> median(data$Income)
[1] 124
> mode(data$Income)
[1] "numeric"
> min(data$Income)
[1] 1
> max(data$Income)
[1] 959
> quantile(data$Income)
  0% 25% 50% 75% 100%
       90 124 170 959
> cor(data$Income, data$Amount)
[1] 0.1908201
> cor(data$Amount, data$Income)
[1] 0.1908201
> linearModel <- lm(Amount ~ Income , data=data)</pre>
> print(linearModel)
```

Call:

```
lm(formula = Amount ~ Income, data = data)
Coefficients:
(Intercept)
                Income
    879.87
                  1.13
> data_num=select(data, c('Seniority','Time','Age','Expenses','Income','Assets','Debt','Amou
nt','Price','Finrat','Savings'))
> summary(data num)
  Seniority
                     Time
                                                 Expenses
                                                                 Income
                                    Age
Min.
       : 0.000
                Min.
                       : 6.00
                               Min.
                                     :18.00
                                              Min.
                                                    : 35.0
                                                             Min.
                                                                   : 1.0
1st Ou.: 2.000
                1st Qu.:36.00
                               1st Qu.:28.00
                                              1st Qu.: 35.0
                                                             1st Ou.: 90.0
Median : 5.000
                Median :48.00
                               Median :36.00
                                              Median: 51.0
                                                             Median :124.0
                                              Mean : 55.6
      : 7.991
                Mean
                      :46.45
Mean
                               Mean
                                      :37.08
                                                             Mean
                                                                   :140.6
                                              3rd Qu.: 72.0
 3rd Qu.:12.000
                3rd Qu.:60.00
                               3rd Qu.:45.00
                                                             3rd Qu.:170.0
       :48.000
                       :72.00
                                      :68.00
                                                    :180.0
                                                                   :959.0
Max.
                Max.
                               Max.
                                              Max.
                                                             Max.
    Assets
                     Debt
                                     Amount
                                                   Price
                                                                 Finrat
                                                     : 105
                                                                    : 6.702
Min.
             0
                Min.
                                 Min.
                                        : 100
                       :
                           0.0
                                               Min.
                                                              Min.
                                 1st Qu.: 700
                                                              1st Qu.: 60.030
1st Qu.:
             0
                1st Qu.:
                           0.0
                                               1st Qu.: 1116
Median :
          3000
                Median :
                           0.0
                                 Median :1000
                                               Median: 1400
                                                              Median : 77.097
Mean
          5355
                Mean
                          342.3
                                 Mean
                                       :1039
                                               Mean
                                                     : 1462
                                                              Mean
                                                                    : 72.616
 3rd Qu.: 6000
                3rd Qu.:
                                 3rd Qu.:1300
                                               3rd Qu.: 1692
                                                              3rd Qu.: 88.460
                           0.0
       :300000
                Max.
                       :30000.0
                                 Max.
                                        :5000
                                               Max.
                                                     :11140
                                                              Max.
                                                                    :100.000
Max.
   Savings
      :-8.160
Min.
1st Qu.: 1.615
Median : 3.120
Mean
       : 3.860
 3rd Qu.: 5.196
Max.
       :33.250
> data standardize <- as.data.frame(scale(data num[1:11]))</pre>
 data_standardize
    Seniority
                   Time
                                Age
                                      Expenses
                                                    Income
   0.12334900
              0.9248073 -0.644810184 0.8912814 -0.145049697 -0.46426188
2
   1.10177835 0.9248073 1.903803296 -0.3894013 -0.120105166 -0.46426188
   0.24565267 \ -0.7136439 \ \ 0.811540376 \ \ 1.7621456 \ \ 0.740481143 \ -0.20416871
3
  5
  -0.97738402 \ -0.7136439 \ -1.008897824 \ -0.4918559 \ -0.419439535 \ -0.46426188
  -0.85508035
              0.9248073 -0.098678724 0.9937360 0.915092858 -0.16081985
7
              2.56942237
8
   0.12334900 -2.3520952 -0.917875914 -1.0553562 -0.756190699 -0.46426188
9
  0.83620397
10 -0.97738402
              0.1055817 0.356430826
                                    1.7621456 -0.756190699 -0.46426188
11 -0.24356201
              0.1055817 -0.280722544 0.2253264 -0.194938758 -0.11747099
12 -0.12125834 -0.7136439 -0.735832094 0.2253264 -0.244827820 -0.20416871
13 0.00104533
              0.9248073 -0.644810184
                                    0.9937360
                                              0.728008878 -0.03077327
14 1.34638568 -0.7136439 -0.007656814 0.9937360
                                              0.366313183 -0.16081985
15 -0.97738402 -1.9424823 -1.464007374 -1.0553562 -1.130358660 -0.46426188
                        2.814022396 0.9937360 -0.120105166 -0.10342596
16 -0.97738402 -1.5328695
   0.85717101 -1.5328695
                        1.357671836 -1.0553562
                                              2.361875640 0.96625056
   3.05863704 -1.5328695
                        19 -0.97738402 0.1055817 -0.098678724 -0.5430832 -0.132577432 -0.39923859
20 -0.85508035
              0.9248073 -0.553788274 -1.0553562 -0.045271574 -0.46426188
              0.9248073 -1.099919734 -0.4918559 -0.419439535 -0.46426188
21 -0.73277668
22 -0.36586567
              0.9248073 -1.372985464 -0.5430832 2.287042047 0.40271535
23 -0.85508035
              0.9248073 0.720518466 2.5305552 -0.357078208 -0.29086644
                        2.32481503
              0.9248073
25
   2.20251136
              0.9248073
                        1.266649926 -0.5430832 0.029562018 -0.16081985
26 0.49026000 -0.7136439 1.539715656 0.2253264 -0.132577432 -0.11747099
```

```
27 1.34638568 0.9248073 0.538474646 0.9937360 0.491035836 -0.11747099
28 0.85717101 -0.7136439 0.538474646 0.9937360 1.376566676 -0.11747099
29 -0.61047301 -1.5328695 -1.281963554 0.9937360 -0.693829373 -0.03077327
30 -0.48816934 0.1055817 -0.735832094 -0.5430832 0.116867876 -0.03077327
31 -0.97738402 -0.7136439 -1.281963554 -0.5430832 -0.232355554 -0.24751758
32  0.73486734 -1.5328695  1.266649926  0.9937360  0.715536613 -0.37756416
33 0.24565267 -0.7136439 0.174387006 0.9937360 0.116867876 -0.20416871
34  0.49026000 -0.7136439 -0.189700634 -1.0553562  0.366313183 -0.46426188
35 2.93633337 -1.5328695 2.267890936 -0.5430832 -0.269772350 0.27266877
37 -0.12125834 0.1055817 -0.462766364 0.9937360 -0.319661412 -0.20416871
38 -0.85508035 0.5151945 -0.098678724 0.7375995 -0.519217658 -0.46426188
39 2.69172604 0.9248073 2.449934756 -0.5430832 -0.257300085 0.74950625
40 -0.36586567 0.1055817 -0.553788274 -0.5943105 -0.631468046 -0.46426188
41 1.95790403 0.9248073 0.447452736 0.9937360 -0.045271574 -0.11747099
44 -0.73277668  0.9248073  0.538474646  0.9937360 -0.868441088 -0.20416871
45 -0.85508035 0.9248073 -1.008897824 -1.0553562 -0.257300085 -0.46426188
46 -0.85508035 0.9248073 1.084606106 -1.0553562 1.152065900 0.91423192
47 0.85717101 -0.7136439 0.902562286 0.9937360 1.850512760 -0.16081985
48 -0.73277668 -0.7136439 -0.917875914 -0.3894013 -0.157521962 -0.46426188
49 2.08020769 -0.7136439 1.357671836 0.2253264 0.116867876 0.83620397
50 0.00104533 0.9248073 -0.826854004 0.2253264 0.054506549 -0.11747099
51 -0.36586567 0.9248073 -0.553788274 0.9937360 -0.631468046 -0.11747099
52 -0.97738402 0.9248073 -0.462766364 2.5305552 2.000179944 -0.46426188
53 -0.36586567 -0.7136439 1.266649926 0.9937360 0.740481143 -0.28219666
54 -0.61047301 -2.3520952 -0.007656814 0.2253264 0.116867876 -0.42091302
55 -0.85508035 0.1055817 -0.735832094 1.5060091 -0.506745392 -0.46426188
56 -0.12125834 0.9248073 -1.008897824 -1.0553562 -0.506745392 -0.46426188
57 -0.48816934 -1.1232567 -0.917875914 -0.5430832 -0.506745392 -0.03077327
58 -0.24356201 -1.5328695 2.358912846 0.2253264 0.179229202 -0.11747099
59 0.73486734 -1.5328695 1.630737566 1.7621456 7.163697801 -0.03077327
60 -0.61047301 0.9248073 -0.826854004 0.7375995 1.301733084 -0.46426188
61 0.00104533 0.1055817 -0.553788274 1.7621456 0.116867876 -0.46426188
62 -0.48816934 -0.3040311 -0.917875914 -1.0553562 -0.880913353 -0.46426188
63 1.71329669 -1.5328695 0.265408916 0.9937360 0.615758490 -0.20416871
64 -0.73277668 -0.7136439 -0.189700634 0.9937360 0.141812406 -0.20416871
65 0.85717101 0.9248073 0.538474646 0.9937360 -0.182466493 -0.20416871
68 0.12334900 0.9248073 1.448693746 -0.5430832 0.366313183 -0.24751758
69 1.71329669 0.9248073 0.811540376 1.9158275 0.441146775 0.18597104
70 1.22408201 -0.7136439 -0.098678724 0.2253264 1.214427227 -0.46426188
71 -0.85508035 0.9248073 0.811540376 0.2253264 -0.319661412 0.01257560
72 0.73486734 0.1055817 0.538474646 -0.5430832 0.740481143 0.31601763
73 0.00104533 -0.7136439 -0.553788274 0.9937360 3.372129133 0.31601763
74 -0.36586567 -1.5328695 0.538474646 0.9937360 -0.594051250 -0.20416871
  1.34638568 0.9248073 0.083365096 1.5572364 -0.406967269 -0.46426188
76 0.73486734 -2.3520952 -0.007656814 1.7621456 4.482160750 -0.11747099
78 0.12334900 -0.7136439 1.630737566 0.7375995 1.364094411 2.13666983
   2.56942237 0.1055817 1.721759476 -0.5430832 -0.506745392 -0.20416871
80 0.24565267 -0.7136439 1.630737566 0.2253264 -0.880913353 -0.11747099
81 0.24565267 -0.7136439 1.357671836 0.2253264 0.116867876 -0.46426188
82 -0.85508035 -0.7136439 -0.735832094 0.2253264 -0.880913353 -0.07412213
83 0.36795634 0.9248073 0.174387006 -1.0553562 1.526233861 -0.24751758
84 0.24565267 0.9248073 0.083365096 0.9937360 0.740481143 0.31601763
85 -0.36586567 -1.5328695 -1.190941644 -1.0553562 -0.781135230 0.05592446
```

```
86 0.24565267 0.9248073 -0.826854004 -0.4406286 -0.257300085 -0.46426188
87 2.32481503 0.9248073 1.448693746 0.2253264 -0.194938758 0.40271535
88 -0.97738402 0.9248073 -1.099919734 -0.7992197 -1.130358660 -0.46426188
  2.08020769 0.9248073 2.267890936 0.2253264 0.066978814 -0.46426188
90 -0.61047301 0.9248073 -0.735832094 -1.0553562 -0.880913353 -0.46426188
        Debt
                 Amount
                            Price
                                      Finrat
                                             Savings
  -0.27497275 -0.502926620 -0.980789690 1.076292239 0.09122118
  -0.27497275 2.024730414 2.422252870 -0.275359014 -0.50454540
  -0.27497275 -0.292288534 -0.218724526 -0.230100242 1.09311094
5 -0.27497275 -1.535053242 -0.878968875 -1.890600827 0.86514639
 -0.27497275 -0.818883749 0.290379551 -1.623431387 2.40740313
7
  -0.27497275 1.182178069 0.536976837 0.798038516 -0.53272355
  -0.27497275 -1.766755137 -0.587824981 -2.663882467 -0.31132381
  10 -0.27497275  0.339625725  0.008781358  0.447630897 -1.14325012
12 -0.27497275 -0.818883749 -0.871014124 -0.077396355 -0.12924961
13 1.73355215 0.971539983 0.298334302 0.897113705 0.02681398
14 -0.06608616 -0.924202792 -0.831240368 -0.430915430 0.45190149
15 -0.27497275 -1.345478965 -1.531258473 0.362107682 -0.85475955
16 -0.27497275 -0.292288534 -0.439866609 0.160315079 -0.63514889
17 -0.27497275 0.971539983 1.174947883 -0.219001389 0.23077011
18 1.33184717 -0.924202792 -0.178950770 -1.381615651 0.19856651
23  0.12673223  -0.924202792  -0.207587874  -1.352160865  -0.98223213
24 -0.27497275 -0.186969491 0.054918915 -0.449038167 0.08274655
25 -0.27497275 0.655582854 -0.167814118 1.317653934 0.13296659
26 -0.27497275 -0.713564706 1.014261909 -1.926529193 -0.06979681
27 -0.27497275 -0.081650448 -0.624416837 1.022115112 0.65478417
28 -0.27497275 1.603454242 1.741326168 -0.108943117 -0.09126588
29 -0.27497275 -0.924202792 0.218786790 -1.722186615 -0.92855946
30 2.37628012 0.128987638 -0.239406879 0.550501571 -0.19275601
31 -0.27497275 -1.345478965 -1.690353497 1.342952057 0.82385306
32 -0.27497275 -1.240159922 -1.292615937 -0.166039289 0.72455863
33 -0.27497275 -0.081650448 -0.108948959 -0.043176651 -0.31132381
35 -0.27497275 -0.713564706 -0.417593306 -0.700473724 -0.35502869
36 -0.27497275 -1.134840879 0.155148780 -1.989403832 1.06376988
37 -0.27497275 -0.502926620 -0.417593306 -0.291788568 -0.39183281
38 -0.27497275 -0.186969491 -0.815330865 1.342952057 -0.59352903
39 -0.27497275 0.181647160 -0.258498282 0.682768343 0.03754852
40 -0.27497275 0.550263811 0.377881814 0.189017498 -0.58010000
41 -0.27497275 -0.292288534 -0.470094664 0.220906435 0.07333029
42 -0.27497275 -0.186969491 -0.497140818 0.490043905 2.26920145
43 2.13525713 0.444944768 0.164694482 0.353338959 -0.17284833
44 -0.27497275 0.971539983 0.142421178 1.178635345 -1.07884292
46 3.34037208 2.235368500 1.020625710 1.333628442 0.13722632
47 -0.27497275 0.971539983 1.100173222 -0.146073526 0.34240926
48 -0.27497275 -1.240159922 -1.459665712 0.488087694 0.68162050
49 -0.27497275 -0.608245663 0.501975932 -1.492559803 0.12342478
50 0.52843721 1.182178069 0.406518918 1.006107947 -0.28113293
51 -0.27497275 -0.292288534 0.059691766 -0.618736693 -0.76754146
52 -0.27497275 0.339625725 -0.299862988 1.058091446 1.59405581
53 0.68911920 -0.292288534 -0.711919100 0.787301303 0.17709745
```

```
54 -0.27497275 -1.134840879 0.379472764 -2.119699602 -0.45624000
55 -0.27497275 -0.081650448 -0.186905521 0.084991799 -0.84268320
56 -0.27497275 -0.081650448 -0.357137197 0.400137189 0.01071218
57 -0.27497275 -1.134840879 -0.659417742 -1.221469305 -0.15030581
58 -0.27497275 -0.924202792 -0.659417742 -0.753509202 -0.01612415
59 -0.27497275 -0.502926620 -0.220315476 -0.597993760 3.99590759
60 -0.27497275 1.666645668 1.174947883 0.516297666 0.50388479
62 -0.27497275 -0.924202792 -0.853513671 -0.383588257 -0.37841464
63 -0.27497275 -0.081650448 0.059691766 -0.291788568 -0.29522201
64 -0.27497275 -0.081650448 0.126511676 -0.380840586 -0.29200165
66 -0.27497275 -0.924202792 -0.735783353 -0.618736693 -0.18250941
67 -0.27497275 0.339625725
                          0.161512581 0.201560265 0.64136600
68 -0.27497275 -0.397607577 -0.409638554 -0.101860196
                                                  1.33200692
69 -0.27497275 2.024730414
                          1.173356933 0.897113705 -0.36768011
70 -0.27497275 -0.292288534
                          1.195630236 -1.567683690 0.87484210
71 0.36775522 -0.081650448 -0.517823171 0.752029984 -0.27912021
72 -0.27497275 -0.924202792 -0.696009597 -0.690505793 2.29180046
73 2.93866710 -0.502926620 0.207650138 -1.098383754 2.53869472
74 -0.27497275 -0.713564706 0.433565072 -1.582621223 -0.87028628
75 -0.27497275 -0.081650448 -0.525777922 0.771081662 -0.68166520
76 -0.27497275 -1.134840879 -0.198042173 -1.728600956 1.60479035
77 -0.27497275 -0.292288534 -0.576688330 0.451275353 -1.03590479
78 -0.27497275 1.498135199 1.294269151 0.209551044 -0.04219373
79 -0.27497275 -0.292288534 -0.163041268 -0.315828871 -0.24870570
80 -0.27497275 -0.081650448 -0.042129049 -0.146073526 -0.93929399
81 -0.27497275 -1.029521836 -1.353072046 0.846119122 0.54499917
82 -0.27497275 -0.397607577 -0.576688330
                                     0.228356177 -0.92224503
83 -0.27497275 -0.081650448 -0.258498282 0.211208548 2.63530552
84 -0.27497275 -0.081650448 0.996761456 -1.213628901 0.97682016
85 2.13525713 -1.134840879 1.271995848 -2.477224311 -0.86844607
86 -0.27497275 -0.924202792 -0.649872041 -0.769492659 0.92314750
89 -0.27497275 -0.081650448 -0.271225884 0.234567547 0.34884998
90 -0.27497275 -0.186969491 -0.454185161 0.397108076 -0.44268059
 [ reached 'max' / getOption("max.print") -- omitted 4356 rows ]
> data.mat <- as.matrix(data_standardize)</pre>
> cov.mat <- cor(data standardize)</pre>
> cov.mat
            Seniority
                                        Age
                                                Expenses
                                                              Income
                            Time
Seniority 1.000000000 -0.021873631
                                 0.50608874
                                             0.125680475
                                                         0.121224109
Time
         -0.021873631 1.000000000 -0.05184996 -0.001717144 -0.029915238
          0.506088738 -0.051849964
                                 1.00000000
                                            0.248136938 0.147556491
Age
Expenses
          0.125680475 -0.001717144
                                  0.24813694
                                             1.000000000
                                                         0.255005191
          0.121224109 -0.029915238 0.14755649
Income
                                             0.255005191
                                                         1.000000000
Assets
          0.124240730 -0.083017696 0.18098586
                                             0.018934567
                                                         0.219111978
Debt
         -0.019346612  0.058267474  -0.04618789
                                             0.014770828
                                                         0.144696747
Amount
         -0.007639347
                      0.430858318 0.02903078
                                             0.049539122
                                                         0.190820113
Price
          0.041121984 0.129676827
                                 0.04868519
                                             0.040728033
                                                         0.217789281
Finrat
         -0.073391667
                      0.468641344 -0.03451424
                                             0.024582188 -0.003407192
Savings
          0.093245565 0.101653260 0.06203607 -0.038093908 0.717962971
             Assets
                           Deht
                                     Amount
                                                 Price
                                                             Finrat
                                             0.04112198 -0.073391667
Seniority
         0.12424073 -0.019346612 -0.007639347
Time
         -0.08301770 0.058267474 0.430858318
                                             0.12967683 0.468641344
                                 0.029030782
                                             0.04868519 -0.034514243
Age
          0.18098586 -0.046187886
Expenses
          0.01893457 0.014770828
                                 0.049539122
                                             0.04072803 0.024582188
```

Income

```
Assets
           1.00000000 0.191619494 0.144283763 0.19489363 -0.025059986
Debt
                       1.000000000
                                     0.050902247
                                                  0.04391706 0.008608526
           0.19161949
Amount
           0.14428376
                       0.050902247
                                     1.000000000 0.72502542
                                                               0.473842104
Price
           0.19489363
                       0.043917062
                                     0.725025421
                                                  1.00000000 -0.181347572
Finrat
          -0.02505999
                       0.008608526
                                     0.473842104 -0.18134757 1.0000000000
                       0.004990061 -0.149323053 -0.07036095 -0.123180383
Savings
           0.06700103
               Savings
Seniority
           0.093245565
Time
           0.101653260
Age
           0.062036075
Expenses
          -0.038093908
Income
           0.717962971
Assets
           0.067001028
Debt
           0.004990061
Amount
          -0.149323053
Price
          -0.070360949
          -0.123180383
Finrat
Savings
           1.000000000
> pca <- prcomp(data_standardize,center = T,scale. = T)</pre>
> summary(pca)
Importance of components:
                           PC1
                                  PC2
                                         PC3
                                                 PC4
                                                         PC5
                                                                 PC6
                                                                          PC7
                                                                                  PC8
Standard deviation
                       1.4940 1.4191 1.2053 1.1558 1.03388 0.97976 0.88080 0.73682
Proportion of Variance 0.2029 0.1831 0.1321 0.1214 0.09717 0.08727 0.07053 0.04936
Cumulative Proportion 0.2029 0.3860 0.5181 0.6395 0.73667 0.82393 0.89446 0.94382
                            PC9
                                   PC10
                                           PC11
Standard deviation
                       0.68353 0.32702 0.20945
Proportion of Variance 0.04247 0.00972 0.00399
Cumulative Proportion 0.98629 0.99601 1.00000
> library(ggfortify)
Loading required package: ggplot2
> library(ggplot2)
> autoplot(pca, data = data_num, colour = 'Amount')
    0.075 -
    0.050 -
                                                                          Amount
                                                                               5000
 PC2 (18.31%)
    0.025
                                                                               4000
                                                                               3000
                                                                               2000
    0.000 -
                                                                               1000
    -0.025 -
    -0.050 -
                  -0.10
                                                    0.00
                                                                     0.05
                                   -0.05
```

PC1 (20.29%)

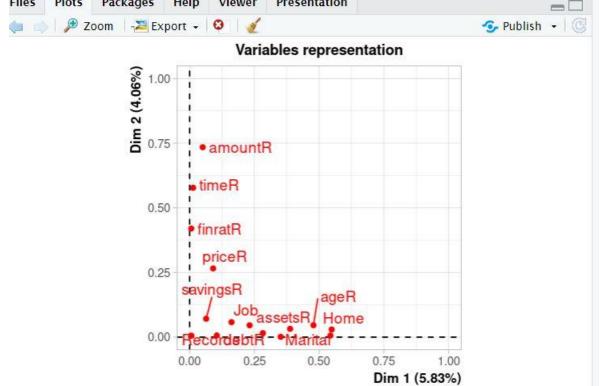
```
> library(FactoMineR)
Error in library(FactoMineR) : there is no package called 'FactoMineR'
> data_categ=select(data, c('Home','Marital','Records','Job','seniorityR','timeR','ageR','ex
pensesR','incomeR','assetsR','debtR','amountR','priceR','finratR','savingsR'))
> summary(data_categ)
    Home
                   Marital
                                    Records
                                                        Job
Length:4446
                                  Length:4446
                                                    Length:4446
                 Length:4446
Class :character Class :character Class :character
                                                    Class :character
Mode :character Mode :character Mode :character
                                                    Mode :character
 seniorityR
                    timeR
                                                     expensesR
                                      ageR
Length:4446
                Length:4446
                                  Length:4446
                                                    Length:4446
Class :character Class :character
                                  Class :character
                                                    Class :character
                                                    Mode :character
Mode :character Mode :character
                                  Mode :character
                  assetsR
  incomeR
                                     debtR
                                                      amountR
Length:4446
                 Length:4446
                                   Length:4446
                                                    Length:4446
Class :character Class :character Class :character
                                                    Class :character
Mode :character Mode :character
                                  Mode :character
                                                    Mode :character
                  finratR
   priceR
                                   savingsR
Length:4446
                 Length:4446
                                   Length:4446
Class :character Class :character Class :character
Mode :character Mode :character
                                   Mode :character
> data(data categ)
Warning message:
In data(data_categ) : data set 'data_categ' not found
> res.mca <- MCA(data_categ,</pre>
               quali.sup = 1:16, # Supplementary qualitative variable
               graph=FALSE)
Error in MCA(data categ, quali.sup = 1:16, graph = FALSE) :
 could not find function "MCA"
> install.packages(c("FactoMineR", "factoextra"))
Installing packages into '/cloud/lib/x86_64-pc-linux-gnu-library/4.2'
(as 'lib' is unspecified)
also installing the dependencies 'corrplot', 'viridis', 'ggsci', 'cowplot', 'ggsignif', 'pol
ynom', 'rstatix', 'plyr', 'dendextend', 'ggpubr', 'reshape2'
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/corrplot_0.92.tar.gz'
Content type 'application/x-gzip' length 3842498 bytes (3.7 MB)
_____
downloaded 3.7 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/viridis_0.6.2.tar.gz'
Content type 'application/x-gzip' length 2997398 bytes (2.9 MB)
_____
downloaded 2.9 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/ggsci_2.9.tar.gz'
Content type 'application/x-gzip' length 2979553 bytes (2.8 MB)
_____
downloaded 2.8 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/cowplot_1.1.1.tar.gz'
Content type 'application/x-gzip' length 1376382 bytes (1.3 MB)
_____
downloaded 1.3 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/ggsignif_0.6.3.tar.gz'
Content type 'application/x-gzip' length 600746 bytes (586 KB)
_____
downloaded 586 KB
```

```
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/polynom_1.4-1.tar.gz'
Content type 'application/x-gzip' length 404572 bytes (395 KB)
_____
downloaded 395 KB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/rstatix_0.7.0.tar.gz'
Content type 'application/x-gzip' length 597842 bytes (583 KB)
_____
downloaded 583 KB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/plyr_1.8.7.tar.gz'
Content type 'application/x-gzip' length 1159494 bytes (1.1 MB)
_____
downloaded 1.1 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/dendextend_1.16.0.tar.gz'
Content type 'application/x-gzip' length 3895307 bytes (3.7 MB)
_____
downloaded 3.7 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/ggpubr_0.4.0.tar.gz'
Content type 'application/x-gzip' length 1897240 bytes (1.8 MB)
downloaded 1.8 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/reshape2_1.4.4.tar.gz'
Content type 'application/x-gzip' length 550845 bytes (537 KB)
_____
downloaded 537 KB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/FactoMineR_2.6.tar.gz'
Content type 'application/x-gzip' length 3799947 bytes (3.6 MB)
_____
downloaded 3.6 MB
trying URL 'http://rspm/default/__linux__/focal/latest/src/contrib/factoextra_1.0.7.tar.gz'
Content type 'application/x-gzip' length 414461 bytes (404 KB)
_____
downloaded 404 KB
* installing *binary* package 'corrplot' ...
* DONE (corrplot)
* installing *binary* package 'viridis' ...
* DONE (viridis)
* installing *binary* package 'ggsci' ...
* DONE (ggsci)
* installing *binary* package 'cowplot' ...
* DONE (cowplot)
* installing *binary* package 'ggsignif' ...
* DONE (ggsignif)
* installing *binary* package 'polynom' ...
* DONE (polynom)
* installing *binary* package 'plyr' ...
* DONE (plyr)
* installing *binary* package 'FactoMineR' ...
* DONE (FactoMineR)
* installing *binary* package 'rstatix' ...
* DONE (rstatix)
```

```
* installing *binary* package 'dendextend' ...
* DONE (dendextend)
* installing *binary* package 'reshape2' ...
* DONE (reshape2)
* installing *binary* package 'ggpubr' ...
* DONE (ggpubr)
* installing *binary* package 'factoextra' ...
* DONE (factoextra)
The downloaded source packages are in
         '/tmp/RtmpqLf93S/downloaded packages'
> library("FactoMineR")
> library("factoextra")
Welcome! Want to learn more? See two factoextra-related books at https://goo.gl/ve3WBa
> res.mca <- MCA(data_categ,</pre>
                 quali.sup = 1:16, # Supplementary qualitative variable
                 graph=FALSE)
Error in `[.data.frame`(X, , quali.sup, drop = FALSE) :
  undefined columns selected
> res.mca <- MCA(data_categ)</pre>
Warning message:
ggrepel: 5 unlabeled data points (too many overlaps). Consider increasing max.overlaps
> fviz mca biplot (res.mca, repel = TRUE,
Warning messages:
1: ggrepel: 3 unlabeled data points (too many overlaps). Consider increasing max.overlaps
2: ggrepel: 3 unlabeled data points (too many overlaps). Consider increasing max.overlaps
                   ggtheme = theme minimal())
Files Plots Packages Help Viewer Presentation
       🔎 Zoom 🛛 -🔀 Export 🗸 🗯 🦋

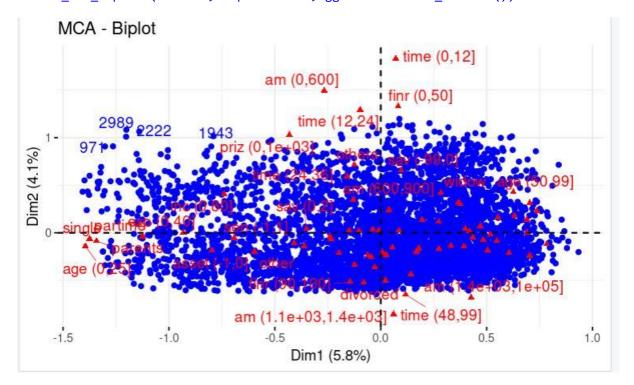
    Publish 
    □

                               Variables representation
                   1.00
```



```
Warning messages:
```

```
1: ggrepel: 4446 unlabeled data points (too many overlaps). Consider increasing max.overlaps
2: ggrepel: 56 unlabeled data points (too many overlaps). Consider increasing max.overlaps
> res.mca <- MCA(data_categ)
Warning messages:
1: ggrepel: 4442 unlabeled data points (too many overlaps). Consider increasing max.overlaps
2: ggrepel: 46 unlabeled data points (too many overlaps). Consider increasing max.overlaps
3: ggrepel: 4442 unlabeled data points (too many overlaps). Consider increasing max.overlaps
4: ggrepel: 46 unlabeled data points (too many overlaps). Consider increasing max.overlaps
5: ggrepel: 5 unlabeled data points (too many overlaps). Consider increasing max.overlaps
> fviz_mca_biplot (res.mca, repel = TRUE, ggtheme = theme_minimal())
```



```
Warning messages:
1: ggrepel: 3 unlabeled data points (too many overlaps). Consider increasing max.overlaps
2: ggrepel: 3 unlabeled data points (too many overlaps). Consider increasing max.overlaps
3: ggrepel: 4446 unlabeled data points (too many overlaps). Consider increasing max.overlaps
4: ggrepel: 56 unlabeled data points (too many overlaps). Consider increasing max.overlaps
> head(var$cos2, 4)
Error in var$cos2 : object of type 'closure' is not subsettable
In addition: Warning messages:
1: ggrepel: 4442 unlabeled data points (too many overlaps). Consider increasing max.overlaps
2: ggrepel: 46 unlabeled data points (too many overlaps). Consider increasing max.overlaps
3: ggrepel: 4442 unlabeled data points (too many overlaps). Consider increasing max.overlaps
4: ggrepel: 46 unlabeled data points (too many overlaps). Consider increasing max.overlaps
> fviz_mca_var(res.mca, col.var = "cos2",
               gradient.cols = c("#00AFBB", "#E7B800", "#FC4E07"),
               repel = TRUE,
               ggtheme = theme_minimal())
Warning message:
```

ggrepel: 57 unlabeled data points (too many overlaps). Consider increasing max.overlaps

