LOGISTICS REGRESSION ON BANK DATA

USING R STUDIO

```
> library(haven)
> Zcench_Bank_Dta1 <- read_sav("D:/reachout analytics/case studies/Zcench_Bank Dta1.sav")
> View(Zcench_Bank_Dta1)
> bank = subset(Zcench_Bank_Dtal, select = -c(Obs, account_id) )
> View(bank)
> x <- bank[,1:37]
> View(x)
> y <- bank[,38]
> View(v)
> y_final=ifelse(bank$good=="Yes", 1, 0)
> y_final
 [677] 1 1 1 1 1 1
```

> summary(x)					
cardwdln	cardwdlt	cashern	cashcrt	cashwdn	cashwdt
Min. : 0.000	Min. : 0 N	in. : 1.00	Min. : 200	Min. : 13.0	Min. : 30502
1st Qu.: 0.000	1st Qu.: 0 1	st Qu.: 10.00	1st Qu.: 40800	1st Qu.: 70.0	1st Qu.: 354510
Median : 0.000	Median: 0 N	ledian : 39.00	Median : 627659	Median: 99.0	Median : 700814
Mean : 1.415	Mean : 3640 N	lean : 42.52	Mean : 796445	Mean :116.9	Mean : 888342
3rd Qu.: 0.000	3rd Qu.: 0	3rd Qu.: 63.00	3rd Qu.:1235188	3rd Qu.:161.0	3rd Qu.:1206393
Max. :34.000	Max. :83000 N	lax. :148.00	Max. :3708832	Max. :324.0	Max. :3392850
bankcolt	bankcoln	bankrn	bankrt	othern	othcrt
Min. : 0	Min. : 0.00	Min. : 1.00	Min. : 1901	Min. : 10.00	Min. : 969
1st Qu.: 0	1st Qu.: 0.00	1st Qu.: 21.00	1st Qu.: 85248	1st Qu.: 27.00	1st Qu.: 4370
Median: 0		Median : 44.50	Median : 196322	Median : 38.00	Median : 6489
Mean : 383349	Mean :11.89	Mean : 62.18	Mean : 245154	Mean : 45.95	
3rd Qu.: 527640	3rd Qu.:22.00	3rd Qu.: 88.00	3rd Qu.: 341921		
Max. :3552197	Max. :72.00	Max. :287.00	Max. :1040262	Max. :191.00	Max. :30029
days	sex	card	age	second	frequency
Min. : 374.0		Length: 682			Length: 682
1st Qu.: 802.5					cter Class:character
Median :1070.0	Mode :character	Mode :charact			cter Mode :character
Mean :1220.6			Mean :41.4		
3rd Qu.:1681.5			3rd Qu.:52.1		
Max. :2178.0			Max. :64.9		
region	cardwd1nd	cardwdltd	cashcrnd	cashcrt	
Length: 682	Min. :0.00000				0.18 Min. :0.03476
Class :character					33.69 1st Qu.: 0.08065
Mode :character	Median :0.00000				
	Mean :0.00112				43.22 Mean :0.09338
	3rd Qu.:0.00000				
	Max. :0.02224				76.69 Max. :0.15190
cashwdtd	bankcoltd	bankcolnd	bankrnd	bankrtd	othernd
Min. : 49.01	Min. : 0.0	Min. :0.00000			
1st Qu.: 365.92	1st Qu.: 0.0	1st Qu.: 0.00000			
Median : 654.12	Median: 0.0	Median :0.00000			
Mean : 724.19	Mean : 325.4	Mean :0.01006			
3rd Qu.:1050.79	3rd Qu.: 627.6	3rd Qu.: 0.03235			
Max. :2363.51	Max. :1790.5	Max. :0.03361			155 Max. :0.09947

```
abankr
    othcrtd
                    acardwd]
                                  acashcr
                                                 acashwd
                                                                  abankcol
 Min. : 1.364
                                              Min. : 850.3
                                                                               Min. : 312
                 Min. :
                               Min. : 200
                                                               Min. :
 1st Qu.: 4.766
                 1st Qu.:
                               1st Qu.: 4283
                                              1st Qu.: 4371.0
                                                               1st Qu.:
                                                                               1st Qu.: 2723
 Median: 6.088
                 Median:
                               Median :15970
                                              Median: 7518.6
                                                               Median:
                                                                               Median: 4211
      : 6.300
                 Mean : 574
                                      :14154
                                              Mean : 7421.0
                                                                     : 9963
                               Mean
                                                               Mean
                                                                               Mean : 4590
 Mean
 3rd Qu.: 7.596
                 3rd Qu.: 0
                               3rd Qu.:22851
                                               3rd Qu.:10264.9
                                                                3rd Qu.:19122
                                                                               3rd Qu.: 6170
 Max. :19.768
                        :6600
                               Max.
                                      :31248
                                              Max.
                                                     :16958.0
                                                               Max.
                                                                      :54825
                                                                               Max.
                                                                                     :12683
                 Max.
     aothcr
 Min. : 43.9
 1st Qu.:133.9
 Median :172.7
 Mean :173.6
 3rd Qu.:212.8
 Max. :335.1
>
```

> library(pastecs) > stat.desc(x)

> stat.desc()	()							
THE STREET, ST	cardwdln	cardwdlt	cashcrn	cashcrt	cashwdn	cashwdt	k	pankcolt
nbr.val	682.0000000	6.820000e+02	682.000000	6.820000e+02	6.820000e+02	6.820000e+02	6.820	0000e+02
nbr.null	534.0000000	5.340000e+02	0.000000	0.000000e+00	0.000000e+00	0.000000e+00	4.720	0000e+02
nbr.na	0.0000000	0.000000e+00	0.000000	0.000000e+00	0.000000e+00	0.000000e+00	0.000	000e+00
min	0.0000000	0.000000e+00	1.000000	2.000000e+02	1.300000e+01	3.050220e+04	0.000	000e+00
max	34.0000000	8.300000e+04	148.000000	3.708832e+06	3.240000e+02	3.392850e+06	3.552	2197e+06
range	34.0000000	8.300000e+04	147.000000	3.708632e+06	3.110000e+02	3.362348e+06	3.552	2197e+06
sum	965.0000000	2.482600e+06	29001.000000	5.431758e+08	7.973800e+04	6.058496e+08	2.614	1443e+08
median	0.0000000	0.000000e+00	39.000000	6.276590e+05	9.900000e+01	7.008136e+05	0.000	000e+00
mean	1.4149560	3.640176e+03	42.523460	7.964454e+05	1.169179e+02	8.883424e+05	3.833	3494e+05
SE. mean	0.1569420	4.024775e+02	1.294612	3.048655e+04	2.353701e+00	2.564952e+04	2.721	105e+04
CI.mean. 0.95	0.3081482	7.902459e+02	2.541910	5.985893e+04	4.621382e+00	5.036164e+04	5.342	2763e+04
var	16.7981901	1.104759e+08	1143.045704	6.338713e+11	3.778216e+03	4.486863e+11	5.049	9808e+11
std.dev	4.0985595	1.051075e+04	33.808959	7.961603e+05	6.146720e+01	6.698405e+05	7.106	5200e+05
coef.var	2.8965985	2.887430e+00	0.795066	9.996421e-01	5.257296e-01	7.540341e-01	1.853	3714e+00
1 50	bankcolr	n bankrn	bankr1	t other	n others	t days	sex	card
nbr.val	682.0000000	6.820000e+02	6.820000e+02	2 6.820000e+02	2 6.820000e+02	2 6.820000e+02	NA NA	NA
nbr.null	472.0000000	0.000000e+00	0.000000e+00	0.000000e+00	0.000000e+00	0.000000e+00) NA	NA
nbr.na	0.0000000	0.000000e+00	0.000000e+00	0.000000e+00	0.000000e+00	0.000000e+00) NA	NA
min	0.0000000	1.000000e+00	1.901000e+03	1.000000e+0	L 9.690000e+02	2 3.740000e+02	NA	NA
max	72.0000000	2.870000e+02	1.040262e+06	5 1.910000e+02	2 3.002930e+04	2.178000e+03	NA.	NA
range	72.0000000	2.860000e+02	1.038361e+06	5 1.810000e+02	2.906030e+04	1.804000e+03	NA NA	NA
sum	8106.0000000	4.240800e+04	1.671948e+08	3.133800e+04	5.300731e+0	8.324560e+0	NA NA	NA
medi an	0.0000000	4.450000e+01	1.963218e+0	3.800000e+03	L 6.489400e+03	3 1.070000e+03	NA NA	NA
mean	11.8856305	6.218182e+01	2.451537e+05	5 4.595015e+0	L 7.772333e+03	3 1.220610e+03	NA NA	NA
SE. mean	0.7772382	2.082669e+00	7.870811e+03	3 1.017397e+00	1.831863e+02	2 1.991879e+01	L NA	NA
CI. mean. 0.95	1.5260712	4.089223e+00	1.545397e+04	1.997612e+00	3.596779e+02	3.910961e+01	L NA	NA
var	411.9957110	2.958181e+03	4.224968e+10	7.059358e+02	2.288604e+07	7 2.705890e+05	5 NA	NA
std.dev	20.2976775	5.438917e+01	2.055473e+0	5 2.656945e+03	L 4.783935e+03	3 5.201817e+02	NA S	NA
coef.var	1.7077493	8.746796e-01	8.384426e-01	1 5.782235e-03	L 6.155083e-01	L 4.261654e-01	L NA	NA

```
age second frequency region
                                                      cardwd1nd
                                                                    cardwd1td
                                                                                  cashcrnd
                                                                                               cashcrtd
nbr. val
             6.820000e+02
                               NA
                                         NA
                                                NA 6.820000e+02
                                                                  682.0000000 6.820000e+02 6.820000e+02
                               NA
nbr. null
             0.000000e+00
                                         NA
                                                NA 5.340000e+02
                                                                 534.0000000 0.000000e+00 0.000000e+00
nbr. na
             0.000000e+00
                               NA
                                         NA
                                                NA 0.000000e+00
                                                                   0.0000000 0.000000e+00 0.000000e+00
min
             1.906640e+01
                               NA
                                         NA
                                                NA 0.000000e+00
                                                                   0.0000000 4.880000e-04 1.800000e-01
max
             6.492270e+01
                               NA
                                         NA
                                                NA 2.223900e-02
                                                                  71.3058000 8.677700e-02 2.476690e+03
range
             4.585630e+01
                               NA
                                         NA
                                                NA 2.223900e-02
                                                                  71.3058000 8.628900e-02 2.476510e+03
sum
             2.823580e+04
                               NA
                                         NA
                                                NA 7.640020e-01 1971.3885000 2.353055e+01 4.386753e+05
median
             4.137440e+01
                               NA
                                         NA
                                                NA 0.000000e+00
                                                                    0.0000000 3.770700e-02 5.861350e+02
mean
             4.140146e+01
                               NA
                                         NA
                                                NA 1.120238e-03
                                                                   2.8905990 3.450227e-02 6.432188e+02
SE. mean
             4.850669e-01
                               NA
                                         NA
                                                NA 1.142097e-04
                                                                    0.2979196 8.319853e-04 2.127258e+01
CI.mean. 0.95 9.524063e-01
                               NA
                                         NA
                                                NA 2.242455e-04
                                                                   0.5849513 1.633565e-03 4.176771e+01
var
             1.604677e+02
                               NA
                                         NA
                                                NA 8.895916e-06
                                                                  60.5316567 4.720801e-04 3.086203e+05
std. dev
             1.266758e+01
                               NA
                                         NA
                                                NA 2.982602e-03
                                                                   7.7802093 2.172740e-02 5.555361e+02
coef. var
             3.059695e-01
                               NA
                                         NA
                                                NA 2.662473e+00
                                                                    2.6915561 6.297385e-01 8.636813e-01
                 cashwdnd
                               cashwdtd
                                           bankcoltd
                                                        bankcolnd
                                                                        bankrnd
                                                                                     bankrtd
                                                                                                  othernd
             6.820000e+02 6.820000e+02 6.820000e+02 6.820000e+02 6.820000e+02 6.820000e+02 6.820000e+02
nbr. val
nbr.null
             0.000000e+00 0.000000e+00 4.720000e+02 4.720000e+02 0.000000e+00 0.000000e+00 0.000000e+00
nbr. na
             0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00
min
             3.476000e-02 4.901000e+01 0.000000e+00 0.000000e+00 1.450000e-03 3.091000e+00 1.669000e-02
max
             1.519000e-01 2.363510e+03 1.790460e+03 3.361300e-02 1.471800e-01 6.001550e+02 9.946900e-02
             1.171400e-01 2.314500e+03 1.790460e+03 3.361300e-02 1.457300e-01 5.970640e+02 8.277900e-02
range
             6.368382e+01 4.938949e+05 2.219019e+05 6.859706e+00 3.422005e+01 1.354987e+05 2.546422e+01
sum
median
             9.297500e-02 6.541200e+02 0.000000e+00 0.000000e+00 4.340000e-02 1.820860e+02 3.275700e-02
             9.337804e-02 7.241861e+02 3.253693e+02 1.005822e-02 5.017603e-02 1.986785e+02 3.733757e-02
mean
SE, mean
             7.413115e-04 1.617025e+01 2.065547e+01 5.778948e-04 1.348647e-03 5.003015e+00 4.769681e-04
CI.mean. 0.95 1.455531e-03 3.174953e+01 4.055606e+01 1.134670e-03 2.648006e-03 9.823188e+00 9.365047e-04
var
             3.747882e-04 1.783272e+05 2.909742e+05 2.277623e-04 1.240455e-03 1.707057e+04 1.551540e-04
std. dev
             1.935945e-02 4.222880e+02 5.394203e+02 1.509180e-02 3.522009e-02 1.306544e+02 1.245608e-02
coef.var
             2.073233e-01 5.831209e-01 1.657871e+00 1.500444e+00 7.019307e-01 6.576172e-01 3.336072e-01
```

	othcrtd	acardwd1	acashcr	acashwd	abankco1	abankr	aothcr
nbr.val	6.820000e+02						
nbr.null	0.000000e+00	5.340000e+02	0.000000e+00	0.000000e+00	4.720000e+02	0.000000e+00	0.000000e+00
nbr.na	0.000000e+00						
min	1.364400e+00	0.000000e+00	2.000000e+02	8.503300e+02	0.000000e+00	3.120000e+02	4.389500e+01
max	1.976840e+01	6.600000e+03	3.124758e+04	1.695803e+04	5.482450e+04	1.268287e+04	3.351290e+02
range	1.840400e+01	6.600000e+03	3.104758e+04	1.610770e+04	5.482450e+04	1.237087e+04	2.912340e+02
sum	4.296297e+03	3.915022e+05	9.652914e+06	5.061129e+06	6.794478e+06	3.130203e+06	1.183891e+05
median	6.088000e+00	0.000000e+00	1.597000e+04	7.518560e+03	0.000000e+00	4.211305e+03	1.727425e+02
mean	6.299555e+00	5.740501e+02	1.415383e+04	7.421010e+03	9.962578e+03	4.589740e+03	1.735910e+02
SE. mean	8.956413e-02	4.461129e+01	3.574241e+02	1.374844e+02	6.324772e+02	9.027906e+01	2.119873e+00
CI. mean. 0.95	1.758550e-01	8.759219e+01	7.017856e+02	2.699442e+02	1.241840e+03	1.772587e+02	4.162271e+00
var	5.470822e+00	1.357294e+06	8.712686e+07	1.289113e+07	2.728187e+08	5.558510e+06	3.064812e+03
std.dev	2.338979e+00	1.165030e+03	9.334177e+03	3.590422e+03	1.651722e+04	2.357649e+03	5.536075e+01
coef.var	3.712927e-01	2.029491e+00	6.594805e-01	4.838186e-01	1.657927e+00	5.136782e-01	3.189148e-01
>							

```
> library(fastDummies)
> x_final = dummy_cols(
    select_columns = NULL.
    remove_first_dummy = FALSE,
    remove_most_frequent_dummy = FALSE,
    ignore_na = FALSE,
    split = NULL,
    remove_selected_columns = TRUE
> View(x_final)
> dim(x_final)
[1] 682 49
> colnames(x_final)
     "cardwdln"
                                                                                    "cashcrt"
                               "cardwdlt"
                                                         "cashcrn"
                               "cashwdt"
                                                         "bankcolt"
                                                                                    "bankcoln"
 [5]
     "cashwdn"
                               "bankrt"
                                                         "othcrn"
                                                                                    "othcrt"
 [9]
     "bankrn"
                               "age"
     "days"
                                                         "cardwdlnd"
                                                                                    "cardwdltd"
[13]
                               "cashcrtd"
                                                                                    "cashwdtd"
[17]
     "cashcrnd"
                                                         "cashwdnd"
     "bankcoltd"
                               "bankcolnd"
                                                         "bankrnd"
                                                                                    "bankrtd"
[21]
     "othernd"
                               "othcrtd"
                                                         "acardwd1"
                                                                                    "acashcr"
[25]
                               "abankcol"
                                                         "abankr"
                                                                                    "aother"
[29]
     "acashwd"
[33]
     "sex_F"
                               "sex_M"
                                                         "card_no"
                                                                                    "card_yes"
     "second_N"
                               "second_Y"
                                                         "frequency_After_Tr"
                                                                                    "frequency_Monthly"
[37]
     "frequency_weekly"
                               "region_central Bohemia"
                                                         "region_east Bohemia"
                                                                                    "region_north Bohemia"
                                                                                    "region_south Moravia"
     "region_north Moravia"
                               "region_Prague"
                                                          "region_south Bohemia"
[49] "region_west Bohemia"
```

```
> library(moments)
> skewness(x_final, na.rm = FALSE)
              cardwdln
                                     cardwd1t
                                                              cashcrn
                                                                                      cashcrt
           4.154746241
                                  4.049650122
                                                          0.634799297
                                                                                  1.064042905
               cashwdn
                                      cashwdt
                                                             bankcolt
                                                                                     bankcoln
           0.730327897
                                  1.130378446
                                                          2.025465044
                                                                                  1.554310955
                bankrn
                                       bankrt
                                                               othern
                                                                                       othcrt
           1,432478228
                                  1.335496786
                                                          1.624860544
                                                                                  1.413665976
                                                            cardwd1nd
                                                                                    cardwd1td
                  days
                                           age
          0.391612753
                                  0.005967961
                                                          3.676056557
                                                                                  3.991652901
              cashcrnd
                                     cashcrtd
                                                             cashwdnd
                                                                                     cashwdtd
          -0.254375785
                                  0.520997336
                                                         -0.080863727
                                                                                  0.462627449
             bankcoltd
                                    bankcolnd
                                                              bankrnd
                                                                                      bankrtd
                                  0.832781654
                                                          0.732433668
           1.366759956
                                                                                  0.537035388
               othernd
                                      othcrtd
                                                             acardwd1
                                                                                      acashcr
           2.351899357
                                  0.974604132
                                                          1.886369073
                                                                                 -0.135176280
               acashwd
                                     abankco1
                                                               abankr
                                                                                       aothcr
           0.142361803
                                                          0.700870691
                                                                                  0.064471833
                                  1.366134649
                 sex_F
                                                              card_no
                                                                                     card_yes
                                         sex_M
          -0.041064372
                                  0.041064372
                                                         -1.159222134
                                                                                 1.159222134
              second_N
                                                   frequency_After_Tr
                                                                           frequency_Monthly
                                      second_Y
          -1.404801373
                                                          4.285059016
                                                                                 -1.662754108
                                  1.404801373
     frequency_Weekly region_central Bohemia
                                                  region_east Bohemia
                                                                        region_north Bohemia
          2.156033814
                                  2.174811441
                                                          2.293363435
                                                                                  2.877248083
                                                                        region_south Moravia
 region_north Moravia
                                region_Prague
                                                 region_south Bohemia
           1.742452144
                                  2.293363435
                                                          2.909145869
                                                                                  1.587480633
  region_west Bohemia
           3.009337515
```

```
> kurtosis(x_final, na.rm = FALSE)
                                      cardwd1t
                                                              cashcrn
              cardwdln
                                                                                      cashcrt
             22.967148
                                     21.479050
                                                             2.651457
                                                                                     3.584050
                                       cashwdt
                                                              bankcolt
                                                                                     bankcoln.
               cashwdn
              2.713348
                                      3.889648
                                                              6.599217
                                                                                     4.172114
                bankrn
                                        bankrt
                                                               othern
                                                                                       othcrt
              5.050608
                                      4.645882
                                                              6.341890
                                                                                     5.417253
                                                            cardwd1nd
                                                                                    cardwd1td
                  days
                                           age
                                      1.856900
                                                            18.681014
                                                                                    23.635413
              1.866496
                                      cashcrtd
              cashcrnd
                                                              cashwdnd
                                                                                     cashwdtd
              1.898457
                                      2.399363
                                                             2.965035
                                                                                     2.498627
             bankcoltd
                                     bankcolnd
                                                              bankrnd
                                                                                      bankrtd
                                                             2.697029
              3.392571
                                     1.694382
                                                                                     2.486098
               othernd
                                       othcrtd
                                                              acardwd1
                                                                                      acasher
              8.099410
                                      5.346633
                                                              5.741520
                                                                                     1.439593
               acashwd
                                      abankco1
                                                                abankr
                                                                                       aothcr
              2.107415
                                      3.388263
                                                              3.062860
                                                                                     2.587661
                 sex_F
                                         sex_M
                                                              card_no
                                                                                     card_yes
                                                             2.343796
                                                                                     2.343796
              1.001686
                                      1.001686
                                                   frequency_After_Tr
                                                                            frequency_Monthly
              second_N
                                      second_Y
              2.973467
                                      2.973467
                                                                                     3.764751
                                                            19.361731
      frequency_Weekly region_central Bohemia
                                                  region_east Bohemia
                                                                         region_north Bohemia
              5.648482
                                      5.729805
                                                              6.259516
                                                                                     9.278557
  region_north Moravia
                                 region_Prague
                                                 region_south Bohemia
                                                                         region_south Moravia
              4.036139
                                      6.259516
                                                              9.463130
                                                                                     3.520095
   region_west Bohemia
             10.056112
```

```
> cov(x_final, y = NULL, use = "all.obs",
     method = c("pearson", "kendall", "spearman"))
                                        cardwdlt
                                                    cashcrn
                                                                   cashcrt
                                                                                 cashwdn
                                                                                              cashwdt
                          cardwdln
                      1.679819e+01 4.175893e+04 7.108459e+00 2.837741e+05 3.461856e+01 4.291605e+05
cardwdln
cardwdlt
                     4.175893e+04 1.104759e+08 1.241932e+04
                                                              6.287861e+08 9.173355e+04 1.254574e+09
                     7.108459e+00 1.241932e+04 1.143046e+03 2.395113e+07 1.016185e+03 8.630951e+06
cashcrn
cashcrt
                      2.837741e+05 6.287861e+08 2.395113e+07
                                                              6.338713e+11 2.325112e+07 3.121917e+11
                      3.461856e+01 9.173355e+04 1.016185e+03 2.325112e+07 3.778216e+03 3.152388e+07
cashwdn
cashwdt
                      4.291605e+05 1.254574e+09 8.630951e+06 3.121917e+11 3.152388e+07 4.486863e+11
bankcolt
                      2.487750e+05 8.843629e+08 -1.392162e+07 -2.949235e+11 1.331333e+07 1.650125e+11
bankcoln.
                      2.840480e+00 1.292193e+04 -4.122631e+02 -9.052729e+06 3.477835e+02 2.895702e+06
bankrn
                      2.128421e+01 4.792763e+04 4.594216e+02 4.867020e+06 1.079589e+03 5.720579e+05
bankrt
                      4.390280e+04 1.014267e+08 1.375630e+06 2.401536e+10 4.870257e+06 2.418969e+10
othern
                      1.216022e+01 2.825223e+04 3.856076e+02
                                                              7.245943e+06 1.177196e+03 7.681437e+06
othert
                      5.211641e+03 1.370668e+07 6.905714e+04 1.809367e+09 2.336958e+05 2.328833e+09
days
                     3.249536e+02 8.215301e+05 9.740256e+03 1.835138e+08 2.944405e+04 2.028072e+08
age
                      -3.222854e+00 -8.167516e+03 -1.153024e+01 -3.588424e+05 -3.716559e+01 -5.146878e+05
cardwd1nd
                     1.147578e-02 2.863384e+01 -5.156414e-04 9.528954e+01 4.431790e-03 1.694243e+02
cardwd1td
                     2.862161e+01 7.678288e+04 -6.019662e+00 1.642874e+05 1.304912e+01 5.565153e+05
cashcrnd
                      -1.700071e-03 -8.699517e+00 5.741555e-01 1.256929e+04 2.211255e-02 1.240761e+03
cashcrtd
                     7.734666e+01 1.250050e+05 1.269674e+04 3.700225e+08 3.744596e+03 1.318293e+08
cashwdnd
                     3.280288e-03 1.109649e+01 8.537733e-02 4.579066e+03 7.205856e-01 8.937296e+03
cashwdtd
                      1.398476e+02 4.880916e+05 1.095468e+03 1.264453e+08 7.216126e+03 2.139045e+08
                          bankcolt
                                        bankcoln
                                                       bankrn
                                                                    bankrt
                                                                                  othern
                                                                                               othert
cardwdln
                    2.487750e+05 2.840480e+00 2.128421e+01 4.390280e+04 1.216022e+01
                                                                                        5.211641e+03
cardwdlt
                    8.843629e+08 1.292193e+04 4.792763e+04 1.014267e+08 2.825223e+04
                                                                                        1.370668e+07
cashern
                      -1.392162e+07 -4.122631e+02 4.594216e+02 1.375630e+06 3.856076e+02 6.905714e+04
cashcrt
                      -2.949235e+11 -9.052729e+06 4.867020e+06
                                                              2.401536e+10 7.245943e+06 1.809367e+09
cashwdn
                     1.331333e+07 3.477835e+02 1.079589e+03 4.870257e+06 1.177196e+03 2.336958e+05
cashwdt
                      1.650125e+11 2.895702e+06 5.720579e+05 2.418969e+10 7.681437e+06
                                                                                         2.328833e+09
bankcolt
                      5.049808e+11 1.321166e+07 3.471449e+06 4.253350e+10 2.396349e+06 8.964488e+08
                      1.321166e+07 4.119957e+02 1.323380e+02 1.240419e+06 9.034671e+01 1.903253e+04
bankcoln
bankrn
                      3.471449e+06 1.323380e+02 2.958181e+03
                                                              7.816448e+06 5.084100e+02 6.168501e+04
bankrt
                      4.253350e+10 1.240419e+06 7.816448e+06 4.224968e+10 1.998009e+06
                                                                                        3.365907e+08
othern
                      2.396349e+06 9.034671e+01 5.084100e+02
                                                              1.998009e+06 7.059358e+02 1.032305e+05
othert
                      8.964488e+08 1.903253e+04 6.168501e+04
                                                              3.365907e+08 1.032305e+05 2.288604e+07
days
                     7.501535e+07 2.393240e+03 1.387209e+04
                                                              5.521954e+07 1.063491e+04 1.820002e+06
                     -1.591926e+05 4.432083e-01 5.604678e+00 1.078255e+04 -9.041659e+00 -3.849296e+03
age
cardwd1nd
                     1.142992e+02 -3.421802e-05 7.262428e-03 -2.767009e+00 5.906903e-04 2.332172e+00
cardwd1td
                      4.943633e+05 4.231427e+00 1.507803e+01 -1.167834e+04 -2.911200e-01 6.291254e+03
```

cardwd1nd	1.142992e+02 -3.421802e-05 7.262428e-03 -2.767009e+00 5.906903e-04 2.332172e+0
cardwd1td	4.943633e+05 4.231427e+00 1.507803e+01 -1.167834e+04 -2.911200e-01 6.291254e+0
cashcrnd	-1.154214e+04 -3.441042e-01 8.255751e-03 -2.300392e+02 1.030889e-02 5.047645e+0
cashcrtd	-2.397556e+08 -7.368263e+03 -1.975118e+03 -3.828199e+06 2.552289e+02 4.652696e+0
cashwdnd	4.380549e+03 8.616139e-02 -1.035292e-01 -7.744766e+01 1.377649e-01 4.534031e+0
cashwdtd	8.179762e+07 8.925653e+02 -6.017299e+03 -8.978603e+06 1.803049e+00 7.050688e+0
50,212 S. A. B. B. C. C.	days age cardwdlnd cardwdltd cashcrnd cashcrt
cardwdln	3.249536e+02 -3.222854e+00 1.147578e-02 2.862161e+01 -1.700071e-03 7.734666e+0
cardwd1t	8.215301e+05 -8.167516e+03 2.863384e+01 7.678288e+04 -8.699517e+00 1.250050e+0
cashcrn	9.740256e+03 -1.153024e+01 -5.156414e-04 -6.019662e+00 5.741555e-01 1.269674e+0
cashcrt	1.835138e+08 -3.588424e+05 9.528954e+01 1.642874e+05 1.256929e+04 3.700225e+0
cashwdn	2.944405e+04 -3.716559e+01 4.431790e-03 1.304912e+01 2.211255e-02 3.744596e+0
cashwdt	2.028072e+08 -5.146878e+05 1.694243e+02 5.565153e+05 1.240761e+03 1.318293e+0
bankcolt	7.501535e+07 -1.591926e+05 1.142992e+02 4.943633e+05 -1.154214e+04 -2.397556e+0
bankcoln	2.393240e+03 4.432083e-01 -3.421802e-05 4.231427e+00 -3.441042e-01 -7.368263e+0
bankrn	1.387209e+04 5.604678e+00 7.262428e-03 1.507803e+01 8.255751e-03 -1.975118e+0
bankrt	5.521954e+07 1.078255e+04 -2.767009e+00 -1.167834e+04 -2.300392e+02 -3.828199e+0
othern	1.063491e+04 -9.041659e+00 5.906903e-04 -2.911200e-01 1.030889e-02 2.552289e+0
othert	1.820002e+06 -3.849296e+03 2.332172e+00 6.291254e+03 5.047645e+00 4.652696e+0
days	2.705890e+05 -2.710554e+02 4.765026e-02 1.120454e+02 4.102651e-01 1.134271e+04
age	-2.710554e+02 1.604677e+02 -1.576494e-03 -3.714542e+00 -3.241043e-04 -9.508226e+0
cardwd1nd	4.765026e-02 -1.576494e-03 8.895916e-06 2.227062e-02 -9.602379e-07 7.025441e-0
cardwd1td	1.120454e+02 -3.714542e+00 2.227062e-02 6.053166e+01 -6.541902e-03 1.106483e+0
cashcrnd	4.102651e-01 -3.241043e-04 -9.602379e-07 -6.541902e-03 4.720801e-04 1.041811e+0
cashcrtd	1.134271e+04 -9.508226e+01 7.025441e-02 1.106483e+02 1.041811e+01 3.086203e+0
cashwdnd	2.944047e+00 -1.471827e-02 7.862249e-07 4.317805e-03 -6.804758e-08 2.631878e+0
cashwdtd	4.400106e+03 -2.368767e+02 1.233241e-01 4.365114e+02 7.883247e-01 1.043521e+0
1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1 1	cashwdnd cashwdtd bankcoltd bankcolnd bankrnd bankrt
cardwdln	3.280288e-03 1.398476e+02 8.331459e+01 -9.527067e-04 5.921725e-03 -9.267697e+0
cardwdlt	1.109649e+01 4.880916e+05 4.179588e+05 1.971100e+00 1.216697e+01 -2.628331e+0
cashcrn	8.537733e-02 1.095468e+03 -1.215243e+04 -3.617593e-01 2.003129e-02 -2.201681e+0
cashcrt	4.579066e+03 1.264453e+08 -2.523353e+08 -7.734561e+03 -1.940884e+03 -4.378091e+0
cashwdn	7.205856e-01 7.216126e+03 2.132153e+03 1.993293e-02 -1.636458e-01 -4.150346e+0
cashwdt	8.937296e+03 2.139045e+08 7.035782e+07 5.643481e+02 -5.558668e+03 -7.934777e+0
bankcolt	4.380549e+03 8.179762e+07 3.390749e+08 8.685176e+03 -1.622377e+02 1.818810e+0
bankcoln	8.616139e-02 8.925653e+02 8.673756e+03 2.693635e-01 8.701248e-03 4.816959e+0
bankrn	-1.035292e-01 -6.017299e+03 -1.160943e+03 -2.041228e-02 1.594486e+00 3.454077e+0
bankrt	-7.744766e+01 -8.978603e+06 1.458065e+07 3.771522e+02 3.507524e+03 2.170931e+0
othern	1.377649e-01 1.803049e+00 -7.377838e+02 -1.195960e-02 1.925749e-03 -5.641215e+0

-

othcrt	4.534031e+01	7.050688e+05	1.978873e+05	-3.130562e-01	-1.423684e+01	-6.679804e+03
days	2.944047e+00	4.400106e+03	-1.381984e+04	-3.921165e-01	9.380337e-01	2.648590e+03
age	-1.471827e-02	-2.368767e+02	-5.264307e+01	1.989416e-03	1.906515e-02	8.060436e+01
cardwd1nd	7.862249e-07	1.233241e-01	7.920636e-02	-6.630820e-07	4.868197e-06	-6.286427e-03
cardwd1td	4.317805e-03	4.365114e+02	3.981561e+02	2.267224e-03	1.134786e-02	-1.446438e+01
cashcrnd	-6.804758e-08	7.883247e-01	-9.773121e+00	-2.897264e-04	6.451214e-06	-1.423919e-01
cashcrtd	2.631878e+00	1.043521e+05	-2.039090e+05	-6.244933e+00	-1.498059e+00	-1.417579e+03
cashwdnd	3.747882e-04	5.810629e+00	2.731196e+00	4.382163e-05	-1.641329e-04	-4.338063e-01
cashwdtd	5.810629e+00	1.783272e+05	7.161536e+04	7.802956e-01	-4.546263e+00	-5.694987e+03
10. 10.00 DE 2000	othcrnd	othcrtd	acardwd1	acashcr	acashwd	abankco1
cardwdln	-7.670699e-04	2.125164e+00	2.832072e+03	2.765733e+03	1.248661e+03	2.526469e+03
cardwdlt	-3.387330e+00	5.825791e+03	7.944807e+06	5.368517e+06	4.463812e+06	1.269221e+07
cashcrn	7.967644e-03	5.332245e+00	-2.643237e+02	1.948612e+05	2.274001e+03	-3.721780e+05
cashcrt	7.364407e+01	4.473038e+05	6.868503e+07	5.869329e+09	9.679952e+08	-7.726585e+09
cashwdn	6.295915e-02	3.455917e+01	4.267246e+03	5.738149e+04	2.072403e+04	6.431118e+04
cashwdt	1.098880e+02	7.375710e+05	1.515641e+08	1.720201e+09	1.530003e+09	2.148103e+09
bankcolt	-9.941745e+01	3.120032e+05	9.405498e+07	-4.254110e+09	5.062777e+08	1.037428e+10
bankcoln	6.463538e-03	2.993517e+00	8.631722e+02	-1.311115e+05	2.887419e+03	2.653269e+05
bankrn	-1.422573e-02	-1.597350e+01	-2.589155e+03	-3.483943e+04	-5.594291e+04	-3.616882e+04
bankrt	-8.058178e+01	-6.843279e+03	-4.541516e+06	-1.412813e+08	-8.452560e+07	4.446714e+08
othern	2.099356e-01	2.350140e+01	-1.740475e+02	9.367904e+03	-1.029511e+04	-2.284623e+04
othcrt	2.276578e+01	7.638879e+03	1.210239e+06	7.586480e+06	3.948947e+06	5.990875e+06
days	3.760965e-01	8.315652e+01	9.600182e+03	3.145958e+05	-1.738466e+05	-4.300207e+05
age	-2.336016e-04	-1.384246e+00	-5.183667e+02	-1.887879e+03	-8.431330e+02	-1.726919e+03
cardwd1nd	-1.755014e-06	1.560732e-03	2.250832e+00	1.983484e+00	1.274598e+00	2.386304e+00
cardwd1td	-5.332429e-03	4.394132e+00	6.403946e+03	3.492297e+03	4.442145e+03	1.203229e+04
cashcrnd	-1.135004e-05	1.414268e-03	-5.794597e-01	1.551072e+02	5.073999e+00	-2.992898e+02
cashcrtd	-3.703371e-01	3.056887e+02	5.198672e+04	4.778137e+06	8.746852e+05	-6.243612e+06
cashwdnd	2.807365e-05	2.249678e-02	3.248978e+00	2.558260e+01	3.127323e+01	8.339347e+01
cashwdtd	-1.625851e-01	5.582856e+02	1.338573e+05	1.175121e+06	1.410749e+06	2.192725e+06
	abankr	aothcr	sex_F	sex_M	card_no	card_yes
cardwdln	-8.205286e+02	6.233457e+01	-1.474371e-01	1.474371e-01	-1.063814e+00	1.063814e+00
cardwdlt	-1.733974e+06	1.771715e+05	-3.804423e+02	3.804423e+02	-2.736814e+03	2.736814e+03
cashcrn	-5.249067e+03	3.159856e+01	-5.494335e-01	5.494335e-01	3.509373e-01	-3.509373e-01
cashcrt	6.710194e+07	1.059181e+07	-1.451506e+04	1.451506e+04	-2.543896e+04	2.543896e+04
cashwdn	3.459085e+03	6.279063e+02	-3.236787e-01	3.236787e-01	-3.846681e-01	3.846681e-01
cashwdt	2.794262e+08	1.932036e+07	-7.496567e+03	7.496567e+03	-5.002126e+04	5.002126e+04
bankcolt	3.560717e+08	9.591009e+06	3.135237e+03	-3.135237e+03	-2.833433e+04	2.833433e+04
bankcoln	6.612055e+03	9.086440e+01	-1.412620e-01	1.412620e-01	-9.903497e-02	9.903497e-02
hanken	4 0202840104	4 41 28200 02	6 7147740 01	6 7147740 01	1 4022160,00	1 4022160:00

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bankrt
                       1.396501e+08 -1.340118e+05 -3.542028e+03 3.542028e+03 1.923774e+03 -1.923774e+03
othern
                      -3.542841e+03 -2.044999e+02 3.661512e-01 -3.661512e-01 7.070851e-01 -7.070851e-01
othert
                       6.691701e+05 1.036094e+05 -1.993602e+01 1.993602e+01 -3.472074e+02 3.472074e+02
days
                      -4.974744e+04 6.877454e+00 -3.452672e+00 3.452672e+00 7.027452e+00 -7.027452e+00
                      7.699079e+02 -2.749460e+01 -5.776849e-01 5.776849e-01 1.031518e-01 -1.031518e-01
age
cardwd1nd
                      -6.036629e-01 5.136532e-02 -9.747087e-05 9.747087e-05 -8.422344e-04 8.422344e-04
cardwd1td
                      -1.197274e+03 1.469820e+02 -2.683083e-01 2.683083e-01 -2.173255e+00 2.173255e+00
cashcrnd
                      -2.548385e+00 4.676242e-02 -4.689947e-04 4.689947e-04 9.640693e-05 -9.640693e-05
            1.032707e+05 9.295937e+03 -1.417002e+01 1.417002e+01 -2.579743e+01 2.579743e+01
cashcrtd
cashwdnd
                     6.181197e+00 5.122874e-01 -6.522209e-05 6.522209e-05 -9.842350e-04 9.842350e-04
cashwdtd
                       2.774230e+05 1.607198e+04 -5.634086e+00 5.634086e+00 -5.048258e+01 5.048258e+01
                           second N
                                       second_Y frequency_After_Tr frequency_Monthly frequency_Weekly
cardwdln
                      -5.848954e-02 5.848954e-02
                                                                        8.669543e-02
                                                                                        -9.950220e-02
                                                       1.280677e-02
cardwd1t
                      -1.604618e+02 1.604618e+02
                                                       8.768630e+01
                                                                       1.328071e+02
                                                                                        -2.204934e+02
                   1.701935e-01 -1.701935e-01
                                                                                       1.312263e-01
cashern
                                                       1.751091e-01
                                                                       -3.063353e-01
cashcrt
                     1.731113e+04 -1.731113e+04
                                                       8.561276e+03
                                                                        -3.000084e+04
                                                                                        2.143956e+04
cashwdn
                      -2.157212e-01 2.157212e-01
                                                       3.401286e-01
                                                                        -1.788693e+00
                                                                                        1.448564e+00
cashwdt
                     9.177402e+03 -9.177402e+03
                                                       1.199647e+04
                                                                        -5.326493e+04
                                                                                        4.126846e+04
                                                                                        2.315741e+04
bankcolt
                                                       5.110239e+03
                      -1.925994e+04 1.925994e+04
                                                                        -2.826765e+04
bankcoln
                                                       1.448749e-01
                      -5.015912e-01 5.015912e-01
                                                                       -7.064133e-01
                                                                                        5.615384e-01
bankrn
                      -1.155119e+00 1.155119e+00
                                                      -2.699239e-01
                                                                       7.964224e-01
                                                                                        -5.264985e-01
bankrt
                      -1.056384e+04 1.056384e+04
                                                       1.655559e+03
                                                                        -4.769560e+03
                                                                                        3.114001e+03
othern
                      -2.132581e-01 2.132581e-01
                                                       8.016932e-02
                                                                        -1.470367e-01
                                                                                        6.686734e-02
othert
                      -6.477723e+01 6.477723e+01
                                                       3.657539e+01
                                                                        -1.726416e+02
                                                                                        1.360662e+02
days
                     -7.779081e+00 7.779081e+00
                                                       2.718768e+00
                                                                        -1.072683e+01
                                                                                        8.008066e+00
                      -2.092420e-01 2.092420e-01
                                                       4.856049e-02
                                                                       -1.100458e-01
age
                                                                                        6.148532e-02
cardwd1nd
                                                       1.564229e-05
                      -3.873356e-05 3.873356e-05
                                                                       6.092396e-05
                                                                                        -7.656625e-05
cardwd1td
                                                       8.892193e-02
                      -1.151651e-01 1.151651e-01
                                                                        8.213462e-02
                                                                                        -1.710565e-01
cashernd
                    7.261304e-05 -7.261304e-05
                                                       1.441226e-04
                                                                       -3.300199e-05
                                                                                        -1.111206e-04
                       1.229710e+01 -1.229710e+01
                                                      7.157646e+00
                                                                       -1.908567e+01
cashcrtd
                                                                                        1.192803e+01
cashwdnd
                                                                       -6.219995e-04
                       4.144128e-04 -4.144128e-04
                                                       8.095870e-05
                                                                                        5.410408e-04
cashwdtd
                                                       7.350831e+00
                                                                        -3.349366e+01
                       1.269590e+01 -1.269590e+01
                                                                                         2.614283e+01
                      region_central Bohemia region_east Bohemia region_north Bohemia region_north Moravia
cardwdln
                                2.428721e-03
                                                  -2.181543e-02
                                                                        3.625210e-02
                                                                                            3.002958e-02
cardwdlt
                                                                       1.015408e+02
                               -2.072810e+01
                                                  -3.902317e+01
                                                                                            4.008724e+01
cashern
                               -8.371680e-01
                                                  -7.337838e-02
                                                                        2.585447e-01
                                                                                           -5.495519e-01
cashcrt
                               -1.610918e+04
                                                  -3.502661e+01
                                                                        2.435371e+03
                                                                                           -4.099865e+03
cashwdn
                               -1.800440e-01
                                                -2.674048e-01
                                                                       -8.751706e-01
                                                                                           -1.004982e+00
                                               -1.840151e+03
cashwdt
                               -5.884573e+02
                                                                       -9.905200e+03
                                                                                            3.224893e+03
bankcolt
                               1.476016e+04
                                                  -2.974600e+03
                                                                       -1.136599e+04
                                                                                            4.605119e+03
```

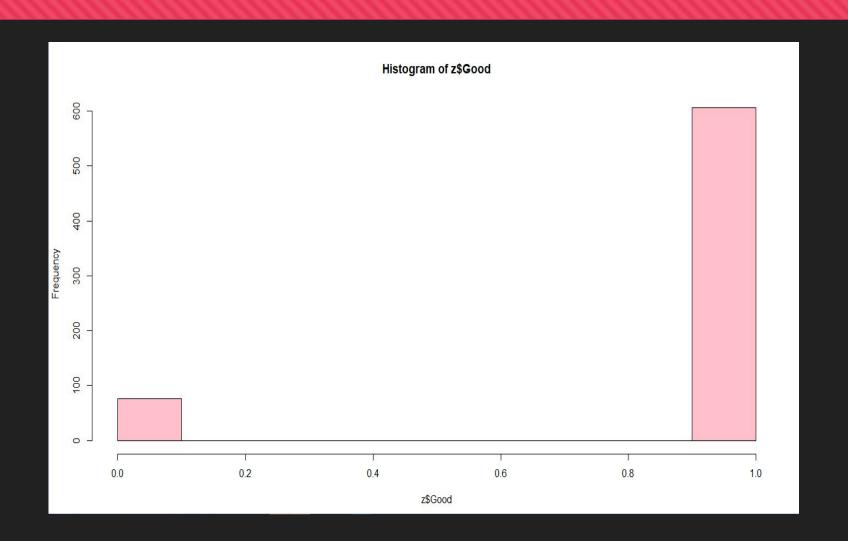
```
cashwdn
                                 -1.800440e-01
                                                     -2.674048e-01
                                                                          -8.751706e-01
                                                                                                -1.004982e+00
cashwdt
                                 -5.884573e+02
                                                     -1.840151e+03
                                                                           -9.905200e+03
                                                                                                 3.224893e+03
                                                     -2.974600e+03
                                                                                                 4.605119e+03
bankcolt
                                 1.476016e+04
                                                                           -1.136599e+04
bankcoln
                                  3.778168e-01
                                                      6.843912e-02
                                                                           -2.805043e-01
                                                                                                -1.242566e-01
bankrn
                                                      1.126685e-01
                                                                            6.195435e-01
                                                                                                -6.979042e-01
                                 -1.429716e-01
bankrt
                                 -7.606790e+02
                                                     -1.288356e+03
                                                                            3.159569e+02
                                                                                                -2.620105e+03
othern
                                 -2.900341e-01
                                                     -1.348198e-01
                                                                          -4.815844e-01
                                                                                                -8.981961e-02
othert
                                -2.929322e+01
                                                      2.473886e+00
                                                                           -5.107301e+01
                                                                                                -1.620070e+01
days
                                -2.270040e+00
                                                      7.074339e-01
                                                                          -2.636135e+00
                                                                                                -1.236324e+01
age
                                 -7.495350e-02
                                                     -1.546995e-01
                                                                           1.017067e-01
                                                                                                 1.667382e-02
cardwd1nd
                                 -1.203286e-05
                                                     -3.049332e-05
                                                                           4.489062e-05
                                                                                                 3.482116e-05
cardwd1td
                                 -4.641851e-02
                                                     -6.376081e-02
                                                                           1.256446e-01
                                                                                                 6.035906e-02
cashcrnd
                                                     -9.830093e-06
                                                                           2.170658e-04
                                                                                                -1.419413e-04
                                 -4.894301e-04
cashcrtd
                                 -6.450948e+00
                                                      1.277059e+00
                                                                           1.116095e+00
                                                                                                 6.156763e-01
cashwdnd
                                                                                                 1.990600e-04
                                 1.187912e-04
                                                     -2.082158e-04
                                                                          -4.344789e-04
cashwdtd
                                                     -8.923934e-01
                                 4.305160e+00
                                                                           -7.893393e+00
                                                                                                 1.071069e+01
                       region_Prague region_south Bohemia region_south Moravia region_west Bohemia
cardwdln
                        -3.356286e-02
                                             -8.659854e-03
                                                                  -3.895643e-02
                                                                                        3.428415e-02
cardwdlt
                       -8.028602e+01
                                             1.657774e+01
                                                                  -6.120807e+01
                                                                                        4.303960e+01
cashcrn
                        5.815409e-01
                                             -5.439172e-01
                                                                   2.356441e-01
                                                                                        9.282860e-01
cashcrt
                                                                   1.094400e+01
                        1.070576e+04
                                             -1.098904e+04
                                                                                        1.808105e+04
cashwdn
                        9.440490e-01
                                              7.771907e-02
                                                                                       1.030368e+00
                                                                   2.754660e-01
cashwdt
                        2.543941e+03
                                              3.538304e+03
                                                                  -2.143124e+03
                                                                                        5.169795e+03
bankcolt
                       -2.503532e+03
                                              1.221620e+04
                                                                  -4.337087e+03
                                                                                       -1.040027e+04
bankcoln.
                                              4.388578e-01
                                                                  -7.231473e-02
                        -5.197204e-02
                                                                                       -3.560660e-01
bankrn
                        9.643572e-01
                                             -6.474436e-01
                                                                  -5.043385e-01
                                                                                        2.960886e-01
bankrt
                        5.788687e+03
                                             -1.874020e+03
                                                                  -2.176493e+03
                                                                                        2.615009e+03
othern
                                             1.760823e-02
                                                                   7.845974e-02
                        6.361053e-01
                                                                                        2.640846e-01
othert
                                             -3.145197e+01
                        8.287036e+01
                                                                   1.774761e+01
                                                                                        2.492704e+01
days
                        1.021404e+01
                                             -3.773272e+00
                                                                   4.321788e-01
                                                                                        9.689033e+00
                       -2.278093e-01
                                                                  -4.691449e-03
age
                                              3.823782e-01
                                                                                       -3.860495e-02
cardwd1nd
                       -8.098316e-06
                                             -5.865275e-06
                                                                  -5.717569e-05
                                                                                        3.395369e-05
cardwd1td
                       -2.596977e-02
                                              2.717748e-02
                                                                  -1.255534e-01
                                                                                        4.852138e-02
cashcrnd
                        2.551347e-04
                                             -2.978736e-04
                                                                   1.486120e-04
                                                                                        3.182627e-04
                        7.308190e+00
cashcrtd
                                             -6.698591e+00
                                                                  -2.701660e+00
                                                                                        5.534179e+00
cashwdnd
                        2.435396e-05
                                              3.489543e-04
                                                                  -7.346041e-05
                                                                                        2.499559e-05
cashwdtd
                       -2.297796e-01
                                              5.016543e+00
                                                                  -6.414997e+00
                                                                                       -4.601830e+00
 [ reached getOption("max.print") -- omitted 29 rows ]
```

Code after calculating covariance

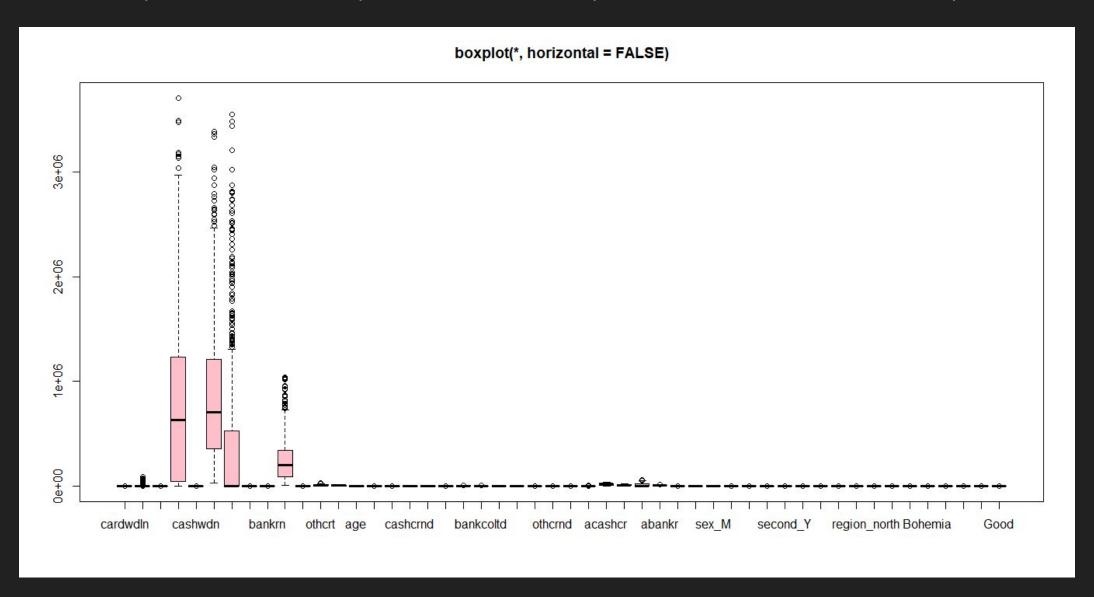
```
cor(x_final, y = NULL, use = "all.obs",
  method = c("pearson"))
z = cbind(x_final,Good=y_final)
View(z)
colnames(z)
```

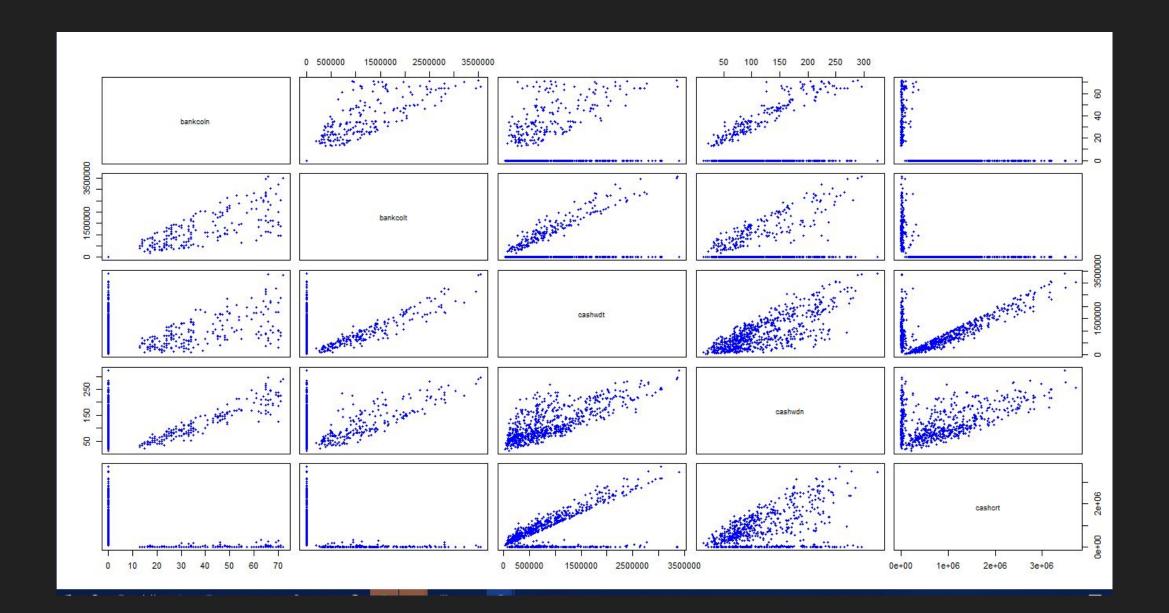
Code to Visualize the data

hist(z\$Good,cl='pink')



boxplot(z, main = "boxplot(*, horizontal = FALSE)", horizontal = FALSE, col='pink')





Code for Model Fitting

logreg <- glm(Good~., data =z, family = binomial) summary(logreg)

Code for Accessing Significant variables

sign_var=z[c(1,4,6,7,9,18,19,20,21,24,28,29,32,34)] sign_var

Code for Stepwise Regression

```
step.model <- step(logreg,direction = "both",trace = 1)
summary(step.model)
```

AIC(step.model)

BIC(step.model)

Results of stepwise regression

```
> summary(step.model)
call:
glm(formula = Good ~ cashcrt + cashwdn + cashwdt + bankcolt +
    bankrt + othcrt + days + cashcrnd + cashcrtd + cashwdnd +
    cashwdtd + bankcoltd + bankcolnd + bankrtd + acardwdl + acashcr +
    acashwd + abankcol + aothcr + card_no + second_N + 'region_north Bohemia' +
    region_west Bohemia, family = binomial, data = z)
Deviance Residuals:
     Min
                      Median
                                    30
                                             Max
-3.15785
           0.00003
                     0.03742
                               0.20651
                                        1.94556
Coefficients:
                         Estimate Std. Error z value Pr(>|z|)
(Intercept)
                        3.624e+01 1.148e+03
                                               0.032 0.97482
cashcrt
                       -5.502e-05 2.154e-05 -2.554
cashwdn
                        5.318e-02 3.019e-02
                                              1.762 0.07815
cashwdt
                        5.417e-05 2.213e-05
                                               2.448
                                                      0.01437 *
bankcolt
                       -5.538e-05 2.149e-05 -2.577
                                                      0.00997 **
                                                      0.00707 **
bankrt
                                  2.180e-05
                                               2.694
othert
                       1.086e-04
                                   6.573e-05
                                              1.652 0.09858
                                             -1.930
                                                     0.05358
days
                       -5.146e-03
                                   2.666e-03
                                  5.487e+01
                                             -3.102
                                                     0.00192 **
cashcrnd
                       -1.702e+02
cashcrtd
                       7.441e-02 2.712e-02
                                              2.744
                                                      0.00608 **
cashwdnd
                       -1.051e+02
                                  5.502e+01
                                             -1.911 0.05600
cashwdtd
                       -6.380e-02
                                  2.727e-02
                                             -2.339
                                                      0.01931 *
bankcoltd
                                   6.246e-02
                                              2.389 0.01687 *
                       1.493e-01
bankcolnd
                                   5.622e+01
                       -1.120e+02
                                              -1.991
                                                      0.04645 *
bankrtd
                       -6.708e-02
                                  2.631e-02
                                             -2.549 0.01080
acardwd1
                       -9.884e-04
                                  4.121e-04
                                              -2.398
                                                     0.01648
acashcr
                       -5.197e-04 1.328e-04
                                             -3.913 9.10e-05
acashwd
                       -7.967e-04
                                  3.283e-04
                                              -2.427
                                                      0.01523
abankcol
                       -2.782e-03 1.693e-03
                                             -1.643 0.10042
aothcr
                       7.122e-02 9.680e-03
                                              7.358 1.87e-13 ***
                       -3.643e+00 1.375e+00
card_no
                                             -2.650 0.00806
second_N
                       -1.800e+01 1.148e+03
                                              -0.016
                                                      0.98749
 `region_north Bohemia`
                       2.279e+00 1.253e+00
                                              1.819
                                                     0.06896 .
                       -9.024e-01
 region_west Bohemia`
                                  5.695e-01
                                              -1.584
                                                      0.11308
```

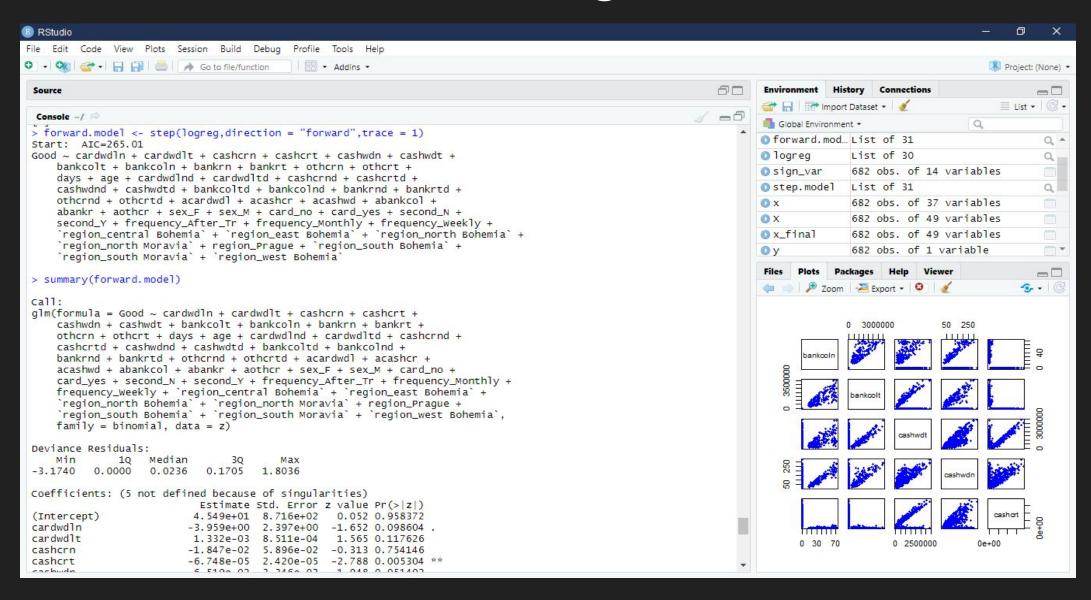
Code for Forward Regression

```
forward.model <- step(logreg,direction = "forward",trace = 1)
summary(forward.model)
```

AIC(forward.model)

BIC(forward.model)

Results of forward regression



```
Estimate Std. Error z value Pr(>|z|)
                          4.549e+01 8.716e+02
                                                  0.052 0.958372
(Intercept)
                         -3.959e+00 2.397e+00
                                                -1.652 0.098604 .
cardwdln
cardwdlt
                          1.332e-03
                                    8.511e-04
                                                 1.565 0.117626
                                    5.896e-02
cashcrn
                         -1.847e-02
                                                 -0.313 0.754146
cashcrt
                                     2.420e-05
                                                -2.788 0.005304 **
                         -6.748e-05
cashwdn
                                    3.346e-02
                                                 1.948 0.051402
                          6.519e-02
                                     2.429e-05
cashwdt
                          6.618e-05
                                                  2.725 0.006433 **
bankcolt
                         -6.725e-05 2.424e-05
                                                -2.774 0.005531 **
                         -4.773e-02 9.783e-02
bankcoln
                                                 -0.488 0.625631
bankrn
                          2.347e-02 1.953e-02
                                                 1.202 0.229439
bankrt
                          6.840e-05 2.483e-05
                                                  2.754 0.005882 **
othern
                         -2.316e-02
                                    5.747e-02
                                                 -0.403 0.687011
othert
                          4.184e-04
                                     4.435e-04
                                                  0.943 0.345444
                                    3.810e-03
days
                         -6.223e-03
                                                 -1.633 0.102435
age
                         -2.377e-02 1.849e-02
                                                -1.286 0.198474
cardwd1nd
                          6.151e+03 4.499e+03
                                                 1.367 0.171568
cardwdltd
                         -1.945e+00 1.531e+00
                                                 -1.270 0.204019
cashcrnd
                         -1.741e+02 1.006e+02
                                                 -1.730 0.083588
                                                 2.938 0.003301 **
cashcrtd
                          8.436e-02
                                    2.871e-02
cashwdnd
                         -1.344e+02 6.208e+01
                                                 -2.165 0.030373
                                     2.822e-02
                                                -2.489 0.012803
cashwdtd
                         -7.024e-02
bankcoltd
                          1.760e-01 7.321e-02
                                                  2.404 0.016226
                         -8.156e+01 1.205e+02
bankcolnd
                                                 -0.677 0.498399
bankrnd
                         -3.681e+01 2.553e+01
                                                 -1.442 0.149271
bankrtd
                         -7.036e-02 2.854e-02
                                                 -2.465 0.013691 *
othernd
                          5.533e+00 8.135e+01
                                                  0.068 0.945780
                         -3.000e-01 6.880e-01
othcrtd
                                                 -0.436 0.662851
acar dwd1
                         -1.273e-03
                                    6.897e-04
                                                 -1.846 0.064932
acasher
                         -5.432e-04 1.489e-04
                                                 -3.649 0.000264
acashwd
                         -1.058e-03 4.148e-04
                                                 -2.551 0.010744
abankco1
                         -3.370e-03 1.999e-03
                                                 -1.686 0.091857 .
abankr
                         -2.143e-04
                                    1.644e-04
                                                 -1.304 0.192355
aothcr
                          7.170e-02 1.671e-02
                                                  4.292 1.77e-05 ***
sex_F
                          2.078e-01
                                     4.691e-01
                                                  0.443 0.657796
sex_M
                                 NA
                                            NA
                                                     NA
                                                              NA
card_no
                         -4.484e+00
                                     2.016e+00
                                                 -2.224 0.026142 *
card_yes
                                 NA
                                            NA
                                                     NA
                                                              NA
second_N
                         -2.046e+01
                                     8.715e+02
                                                -0.023 0.981270
second V
                                 NIA
```

```
second Y
                                NA
                                           NA
                                                   NA
                                                            NA
frequency_After_Tr
                        -4.905e-01 9.733e-01 -0.504 0.614294
frequency_Monthly
                        -6.629e-01
                                    6.513e-01
                                               -1.018 0.308748
frequency_weekly
                                NA
`region_central Bohemia` 8.557e-01
                                    8.530e-01
                                               1.003 0.315750
`region_east Bohemia`
                         1.255e-01
                                    8.261e-01
                                                0.152 0.879221
`region_north Bohemia`
                         3.099e+00
                                    1.406e+00
                                                2.205 0.027448 *
`region_north Moravia`
                                                1.327 0.184611
                         1.059e+00
                                    7.983e-01
region_Prague
                         8.971e-01 8.606e-01 1.042 0.297220
`region_south Bohemia`
                        5.121e-01 9.244e-01
                                               0.554 0.579559
`region_south Moravia`
                         1.630e+00
                                    8.099e-01
                                                2.013 0.044149 *
`region_west Bohemia`
                                NA
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' '1
(Dispersion parameter for binomial family taken to be 1)
   Null deviance: 476.73 on 681 degrees of freedom
Residual deviance: 175.01 on 637 degrees of freedom
AIC: 265.01
Number of Fisher Scoring iterations: 19
> AIC(forward.model)
[1] 265.0111
> BIC(forward.model)
[1] 468.6375
```

Code for Backward Regression

backward.model <- step(logreg,direction = "backward",trace = 1)
summary(backward.model)</pre>

AIC(backward.model)

BIC(backward.model)

Results for backward regression

```
> summary(backward.model)
glm(formula = Good ~ cashcrt + cashwdn + cashwdt + bankcolt +
    bankrt + othert + davs + cashernd + cashertd + cashwdnd +
    cashwdtd + bankcoltd + bankcolnd + bankrtd + acardwdl + acashcr +
    acashwd + abankcol + aothcr + card_no + second_N + `region_north Bohemia`,
    family = binomial, data = z)
Deviance Residuals:
     Min
                     Median
                                            Max
-3.10297
          0.00003
                    0.04153
                              0.21914
                                        2.03085
Coefficients:
                        Estimate Std. Error z value Pr(>|z|)
(Intercept)
                       3.593e+01 1.160e+03
                                             0.031 0.975284
cashcrt
                       -5.722e-05 2.141e-05 -2.673 0.007517 **
cashwdn
                       4.828e-02 2.968e-02
                                             1.627 0.103790
cashwdt
                       5.645e-05 2.196e-05
                                             2.571 0.010131 *
bankcolt
                      -5.731e-05 2.136e-05 -2.683 0.007292
bankrt
                       6.113e-05 2.166e-05
                                             2.823 0.004764 **
othert
                       1.102e-04 6.590e-05
                                            1.673 0.094388 .
days
                       -4.752e-03 2.621e-03 -1.813 0.069837 .
cashcrnd
                      -1.679e+02 5.425e+01 -3.095 0.001966 **
cashcrtd
                       7.673e-02 2.709e-02
                                            2.832 0.004624 **
cashwdnd
                       -1.052e+02 5.415e+01 -1.942 0.052123 .
cashwdtd
                      -6.567e-02 2.714e-02 -2.420 0.015520 *
bankcoltd
                       1.475e-01 6.151e-02
                                             2.398 0.016482 *
bankcolnd
                      -1.086e+02 5.550e+01 -1.956 0.050420
bankrtd
                      -7.012e-02 2.625e-02 -2.671 0.007568 **
acar dwd1
                      -9.552e-04 4.086e-04 -2.338 0.019412
acashcr
                      -5.082e-04 1.309e-04 -3.882 0.000104
acashwd
                      -8.297e-04 3.265e-04 -2.542 0.011037
abankcol
                      -2.652e-03 1.653e-03 -1.605 0.108596
aothcr
                       6.932e-02 9.419e-03
                                             7.359 1.85e-13
card_no
                      -3.537e+00 1.367e+00 -2.586 0.009697 **
second_N
                       -1.798e+01 1.160e+03 -0.016 0.987629
region north Bohemia 2.389e+00 1.246e+00
                                             1.917 0.055213 .
Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 0.05 '.' 0.1 ' ' 1
```

```
Number of Fisher Scoring iterations: 19

> AIC(backward.model)
[1] 238.4932
> BIC(backward.model)
[1] 342.5689
> |
```

THANK YOU