## Assignment 1 - week 10

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1 a) For this problem, you will be working with the thoracic surgery data set from the University of California Irvine machine learning repository. This dataset contains information on life expectancy in lung cancer patients after surgery. The underlying thoracic surgery data is in ARFF format. This is a text-based format with information on each of the attributes. You can load this data using a package such as foreign or by cutting and pasting the data section into a CSV file.

```
setwd("/Users/marianamacdonald/Documents/DATA SCIENCE/DSC 520/Statistics R/Week 2/dsc520")
library(foreign)
thoracic <- read.arff ("data/ThoraricSurgery.arff")</pre>
head(thoracic)
##
      DGN PRE4 PRE5 PRE6 PRE7 PRE8 PRE9 PRE10 PRE11 PRE14 PRE17 PRE19 PRE25 PRE30
## 1 DGN2 2.88 2.16 PRZ1
                              F
                                   F
                                        F
                                               Т
                                                     Т
                                                         0C14
                                                                  F
                                                                         F
                                                                               F
                                                                                      Τ
                                                                  F
                                                                         F
                                                                               F
## 2 DGN3 3.40 1.88 PRZ0
                              F
                                   F
                                        F
                                               F
                                                     F
                                                         0C12
                                                                                      Τ
## 3 DGN3 2.76 2.08 PRZ1
                              F
                                   F
                                        F
                                               Т
                                                     F
                                                        OC11
                                                                  F
                                                                         F
                                                                               F
                                                                                      Τ
## 4 DGN3 3.68 3.04 PRZ0
                              F
                                   F
                                        F
                                               F
                                                     F
                                                         OC11
                                                                  F
                                                                         F
                                                                               F
                                                                                      F
## 5 DGN3 2.44 0.96 PRZ2
                              F
                                   Τ
                                        F
                                               Т
                                                     Т
                                                         OC11
                                                                  F
                                                                         F
                                                                               F
                                                                                      Т
                                   F
                                               Т
                                                         OC11
                                                                                      F
## 6 DGN3 2.48 1.88 PRZ1
     PRE32 AGE Risk1Yr
##
## 1
         F
            60
                      F
         F
            51
                      F
## 2
         F
            59
                      F
         F
            54
                      F
## 4
         F
            73
## 5
                      Τ
         F
## 6
            51
```

b i) Fit a binary logistic regression model to the data set that predicts whether or not the patient survived for one year (the Risk1Y variable) after the surgery. Use the glm() function to perform the logistic regression. See Generalized Linear Models for an example. Include a summary using the summary() function in your results.

```
##
## Call:
##
  glm(formula = Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7 + PRE8 +
       PRE9 + PRE10 + PRE11 + PRE14 + PRE17 + PRE19 + PRE25 + PRE30 +
##
##
       PRE32 + AGE, family = binomial(), data = thoracic)
##
## Deviance Residuals:
##
       Min
                 1Q
                      Median
                                    3Q
                                            Max
  -1.6084 -0.5439
                     -0.4199
                              -0.2762
                                         2.4929
##
## Coefficients:
##
                  Estimate
                            Std. Error z value Pr(>|z|)
## (Intercept)
                -16.551698 2399.545235
                                         -0.007
                                                 0.99450
## DGNDGN2
                 14.736276 2399.544775
                                          0.006
                                                 0.99510
## DGNDGN3
                 14.180552 2399.544754
                                          0.006
                                                 0.99528
## DGNDGN4
                 14.608329 2399.544784
                                          0.006
                                                 0.99514
## DGNDGN5
                 16.381321 2399.544816
                                          0.007
                                                 0.99455
## DGNDGN6
                  0.408854 2673.049086
                                          0.000
                                                 0.99988
                 18.032862 2399.545206
## DGNDGN8
                                          0.008
                                                 0.99400
## PRE4
                 -0.227245
                               0.184911
                                         -1.229
                                                 0.21909
## PRE5
                 -0.030304
                               0.017858
                                         -1.697
                                                 0.08971
## PRE6PRZ1
                                         -0.852
                 -0.442715
                               0.519908
                                                 0.39448
                                         -0.371
## PRE6PRZ2
                 -0.293701
                               0.790690
                                                 0.71030
## PRE7T
                  0.715341
                               0.555560
                                          1.288
                                                 0.19788
## PREST
                  0.174337
                               0.389186
                                          0.448
                                                 0.65419
## PRE9T
                  1.368216
                               0.486768
                                          2.811
                                                 0.00494
## PRE10T
                                          1.196
                  0.576958
                               0.482570
                                                 0.23185
## PRE11T
                  0.516181
                               0.396480
                                          1.302 0.19295
## PRE140C12
                  0.439364
                               0.330092
                                          1.331
                                                 0.18318
                               0.616546
## PRE140C13
                  1.179207
                                          1.913
                                                 0.05580
## PRE140C14
                  1.652973
                               0.609362
                                          2.713
                                                 0.00668 **
## PRE17T
                  0.926593
                               0.444462
                                          2.085
                                                 0.03709 *
## PRE19T
                -14.655378 1653.541054
                                         -0.009
                                                 0.99293
## PRE25T
                                         -0.098
                 -0.097894
                               1.003314
                                                 0.92227
## PRE30T
                  1.083997
                               0.499030
                                          2.172
                                                 0.02984
                                         -0.008
## PRE32T
                -13.983295 1645.313892
                                                 0.99322
## AGE
                 -0.009506
                               0.018099
                                         -0.525
                                                 0.59944
## ---
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
   (Dispersion parameter for binomial family taken to be 1)
##
##
##
       Null deviance: 395.61 on 469
                                       degrees of freedom
## Residual deviance: 341.19
                              on 445
                                       degrees of freedom
  AIC: 391.19
##
## Number of Fisher Scoring iterations: 15
```

## ii) According to the summary, which variables had the greatest effect on the survival rate?

 $\Pr(>|z|) < .05$  (If the coefficient is significantly different than zero, we can assume that the predictors are making a significant contribution to the prediction of the outcome.) Z value - The further a value is from 0, the stronger its role as a predictor

The variables with these characteristics are the PRE9T (meaning patient had dyspnoea before surgery), PRE14OC14 (has the largest tumor), PRE17T (Type 2 DM - diabetes mellitus) and PRE30T (smoker).

iii) To compute the accuracy of your model, use the dataset to predict the outcome variable. The percent of correct predictions is the accuracy of your model. What is the accuracy of your model?

```
library(caTools)
#split the data
split <- sample.split(thoracic, SplitRatio = 0.8)</pre>
split
        TRUE
                     TRUE TRUE TRUE
                                       TRUE TRUE TRUE TRUE FALSE TRUE TRUE
   [1]
              TRUE
## [13] FALSE TRUE TRUE FALSE FALSE
#train model
train <- subset(thoracic, split == "TRUE")</pre>
test <- subset(thoracic, split == "FALSE")</pre>
mymodel <- glm(Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7+ PRE8 + PRE9 + PRE10 + PRE11 +
                 PRE14 + PRE17 + PRE19 + PRE25 + PRE30 + PRE32 + AGE, data = train,
                family = binomial())
summary(mymodel)
##
## Call:
  glm(formula = Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7 + PRE8 +
       PRE9 + PRE10 + PRE11 + PRE14 + PRE17 + PRE19 + PRE25 + PRE30 +
##
##
       PRE32 + AGE, family = binomial(), data = train)
##
## Deviance Residuals:
##
       Min
                 1Q
                      Median
                                   3Q
                                           Max
## -1.6006 -0.5374 -0.4014 -0.2226
                                        2.5086
##
## Coefficients:
                  Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) -14.722806 2399.545455 -0.006 0.99510
## DGNDGN2
                 14.974240 2399.544823
                                        0.006 0.99502
## DGNDGN3
                 14.147884 2399.544797
                                         0.006 0.99530
## DGNDGN4
                 14.419744 2399.544841
                                         0.006 0.99521
## DGNDGN5
                 15.901285 2399.544938
                                         0.007 0.99471
## DGNDGN6
                  1.103078 2901.889989
                                         0.000 0.99970
## DGNDGN8
                 18.391082 2399.545281
                                         0.008 0.99388
## PRE4
                 -0.381383
                              0.219677
                                        -1.736 0.08254
## PRE5
                 -0.030261
                              0.019167
                                       -1.579 0.11438
## PRE6PRZ1
                              0.676019
                                        -1.502 0.13319
                 -1.015133
## PRE6PRZ2
                 -0.619203
                              0.963642
                                        -0.643
                                                0.52051
                                         1.398 0.16203
## PRE7T
                  0.909784
                              0.650641
## PREST
                  0.009514
                              0.466725
                                         0.020 0.98374
## PRE9T
                  1.069269
                              0.626473
                                         1.707 0.08786
```

```
## PRE10T
                  1.074679
                              0.623560
                                          1.723 0.08481 .
## PRF11T
                              0.464313
                                          1.200 0.23006
                  0.557276
## PRE140C12
                  0.465719
                              0.385651
                                          1.208
                                                0.22719
## PRE140C13
                                          1.044
                                                0.29636
                  0.834625
                              0.799243
## PRE140C14
                  1.952286
                              0.680172
                                          2.870
                                                0.00410 **
                                          2.899 0.00374 **
## PRE17T
                  1.475481
                              0.508971
                                        -0.009
## PRE19T
                -14.772790 1648.435592
                                                0.99285
## PRE25T
                  0.150718
                              0.987159
                                          0.153
                                                 0.87865
## PRE30T
                  1.514137
                              0.658860
                                          2.298
                                                 0.02156 *
                                        -0.009
## PRE32T
                -14.050943 1617.539223
                                                 0.99307
  AGE
                 -0.036921
                              0.021380
                                        -1.727 0.08419 .
##
  Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' ' 1
##
  (Dispersion parameter for binomial family taken to be 1)
##
##
       Null deviance: 301.18 on 360 degrees of freedom
## Residual deviance: 251.81 on 336 degrees of freedom
  AIC: 301.81
##
##
## Number of Fisher Scoring iterations: 15
# Run test data through the model built on training data
response <- predict(mymodel, test, type = "response")</pre>
response
                10
                                13
                                                 16
                                                                 17
                                                                                  27
## 0.1250807514551 0.1024595939641 0.0609159262840 0.3259529483986 0.0727352230706
##
                30
                                33
                                                 34
                                                                 44
                                                                                  47
   0.0000001162718 \ \ 0.3432476537526 \ \ 0.1397335476273 \ \ 0.7796722859478 \ \ 0.0632649511181
                50
##
                                51
                                                 61
                                                                 64
                                                                                  67
   0.0180284011279 \ 0.0182199412425 \ 0.1793702261418 \ 0.0669315279244 \ 0.0485475454231
##
##
                68
                                78
                                                 81
                                                                 84
  0.1994413617389\ 0.1097794525351\ 0.1026972994053\ 0.0770180113558\ 0.0988883855323
##
                95
                                98
                                                101
                                                                 102
  0.1743567365877 0.0000001537129 0.0464493447241 0.5218654617109 0.3088085011568
##
               115
                                118
                                                119
                                                                 129
  0.1845000815876 0.4587517282695 0.0351189559542 0.2474979477756 0.0849734732045
##
               135
                                136
                                                146
                                                                 149
                                                                                 152
  0.0721364332176 \ 0.0751652135161 \ 0.0870134408589 \ 0.0606844221766 \ 0.0476862739439
##
               153
                                163
                                                166
                                                                 169
  0.0159899092214 \ 0.2011082277949 \ 0.3234853851290 \ 0.3576902347913 \ 0.1409836639188
##
               180
                                183
                                                186
                                                                 187
  0.2663602127051 \ \ 0.0665582607478 \ \ 0.1548431142073 \ \ 0.0632413427555 \ \ 0.0868693241679
               200
                                203
                                                204
                                                                 214
                                                                                 217
##
   220
                                221
                                                231
                                                                 234
                                                                                 237
  0.0597684038668 0.5894447398222 0.1505218742648 0.1507047711229 0.1207518389635
##
               238
                                248
                                                251
                                                                 254
  0.1359598886388 0.2307737976056 0.0703861637965 0.0867350279557 0.0534669432809
                                                                 272
##
               265
                                268
                                                271
## 0.0821180043075 0.2902816705101 0.1661997092634 0.2359083127098 0.0180592662785
                                288
                                                289
## 0.1013728540150 0.1133427983083 0.5267865834928 0.0684109511182 0.0248033292389
```

```
305
                                                                                                                    306
                                                                                                                                                                                316
                                                                                                                                                                                                                                            319
                                                                                                                                                                                                                                                                                                         322
## 0.0595174962890 0.0973421932518 0.2409503358271 0.0879564979829 0.0367458521758
                                                        323
                                                                                                                    333
                                                                                                                                                                                336
                                                                                                                                                                                                                                             339
          0.0777733440184 \ 0.0920506053963 \ 0.0883456774761 \ 0.0455425270155 \ 0.1297350365666
                                                        350
                                                                                                                    353
                                                                                                                                                                                356
                                                                                                                                                                                                                                             357
          0.0036234297542\ 0.0036834210037\ 0.1123930960258\ 0.3455535172741\ 0.0884034690697
                                                                                                                    373
                                                                                                                                                                                374
          0.0896175245771 0.1317134863997 0.9188723262652 0.0309355591783 0.2016846337350
                                                        390
                                                                                                                    391
                                                                                                                                                                                401
                                                                                                                                                                                                                                             404
          0.6165945233528 \ 0.0767557963136 \ 0.0214283273935 \ 0.1020232434685 \ 0.0780484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046485901 \ 0.00046484855901 \ 0.00046484855901 \ 0.00046484855901 \ 0.0004648485901 \ 0.0004648485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.00046485901 \ 0.0004648
                                                        408
                                                                                                                    418
                                                                                                                                                                                421
                                                                                                                                                                                                                                             424
          0.2070574104708\ 0.0258924708926\ 0.1744349140104\ 0.0366335752509\ 0.1529576248551
                                                        435
                                                                                                                    438
                                                                                                                                                                                441
                                                                                                                                                                                                                                             442
## 0.0871119630026 0.1590574929568 0.1685236710554 0.0330709506473 0.1580448535799
                                                        455
                                                                                                                    458
                                                                                                                                                                                459
## 0.0490560909653 0.1116239670404 0.0246618581763 0.1553304661503
```

response2 <-predict(mymodel, train, type = "response")
response2</pre>

```
1
                                  2
                                                   3
## 0.72224845026072 0.13804123048958 0.09152400360802 0.01688724372854
                 5
                                  6
                                                   7
## 0.15532745085466 0.03226133858231 0.26884463433311 0.14763789670628
                 9
                                 11
                                                  12
## 0.13660789733667 0.09221831921929 0.02879536262445 0.54150084417219
                 15
                                 18
                                                  19
  0.06697766659066 \ 0.23141279830496 \ 0.10317275937803 \ 0.05439044637380
                 21
                                 22
                                                  23
   25
                                 26
                                                  28
   0.44581847989325 0.29022218878546 0.08754982274309 0.14207772310081
                 31
                                 32
                                                  35
   0.36741491922047 0.02257181387243 0.02623068105577 0.10426459010449
                 37
##
                                 38
                                                  39
  0.11351798042623 \ 0.09115541868567 \ 0.05607263291377 \ 0.05830259117125
                 41
                                 42
                                                  43
  0.26843815157393 0.20633558642628 0.08691148494348 0.21757606691831
                 46
                                 48
                                                  49
  0.09238569385273 \ 0.09407438391561 \ 0.17531211301040 \ 0.04064030491068
                53
                                 54
                                                  55
  0.51040654743762 0.07289619137751 0.08641090738746 0.12069037456648
                                 58
                                                  59
  0.08963506089028 0.54906504804553 0.06329654149090 0.09000336768165
                                 63
                                                  65
  0.16159533655380\ 0.04192723176720\ 0.23814164571402\ 0.03840231026973
                 69
                                 70
                                                  71
  0.13105455327819 0.08789280097054 0.00705525428594 0.24358549849279
                                 74
                                                  75
  0.05637678989380 0.01063332497568 0.05287305352385 0.51395455477685
                                 79
                                                  80
  0.16503110362772 \ 0.19593472764387 \ 0.01545418507649 \ 0.49358285169575
                                 86
                                                  87
## 0.10462286734186 0.10035589973787 0.13230356921295 0.13889026012291
```

```
89
                                  90
## 0.45846644936720 0.08281542048637 0.06706690843887 0.06016431167896
                 93
                                  94
                                                    96
## 0.09985511637058 0.03310028978810 0.05504189590994 0.12666291124056
                 99
                                 100
                                                   103
  0.04901746734291 0.19718432525207 0.05650227869321 0.00000002075321
                105
                                 106
                                                   107
## 0.02628210291772 0.03240740559164 0.17150838750245 0.12121889727758
                109
                                 110
                                                   111
  0.01483648232122 \ 0.18160098538377 \ 0.16313505691912 \ 0.01546544127219
                                                   117
                114
                                 116
## 0.05361179795657 0.35377856575723 0.17252737652769 0.14527966301596
                                 122
                                                   123
                121
## 0.03200399281848 0.06244707474007 0.41175015210414 0.06922233108384
                125
                                 126
                                                   127
## 0.10428874053685 0.09149043202087 0.04267303100508 0.39001154782548
                130
                                                   133
##
                                 131
  0.10788715026648 0.06414384080066 0.14203245372286 0.10036451316681
                137
                                                   139
                                 138
  0.29708376760863 0.57508299892476 0.16334296395307 0.01047848138269
##
                141
                                 142
                                                   143
  0.20230787391359 0.05111892145338 0.00437598889169 0.15221613087475
##
                145
                                 147
                                                   148
## 0.21934905112097 0.00912016531266 0.09740524115327 0.05781308068847
                151
                                 154
                                                   155
## 0.03782644723174 0.09408095002286 0.08833457194291 0.06977197713560
                157
                                 158
                                                   159
## 0.29065037647817 0.00000010520465 0.21163659020254 0.11576382943932
                161
                                 162
                                                   164
## 0.01653236698275 0.09127316085354 0.05249072388025 0.60328718468961
                167
                                 168
                                                   171
## 0.21966906815260 0.07821812888116 0.07109321788702 0.56283640979799
                173
                                                   175
                                 174
## 0.48714412240841 0.10959028454069 0.21185855229465 0.36645631575842
                                                   179
                177
                                 178
## 0.53104096335662 0.12526410750512 0.17956998726725 0.15370397597415
## 0.05870242189304 0.14521029997489 0.02319395695234 0.08955537298132
                                 190
## 0.07131496711012 0.07395469863639 0.00000011985024 0.08542603222452
                193
                                 194
                                                   195
## 0.06020646825666 0.10735071887331 0.06726816060611 0.13201681522960
                198
                                 199
                                                   201
## 0.02984738506051 0.01538219002473 0.16755555590414 0.11250616780268
                205
                                 206
                                                   207
## 0.01434607748582 0.13405184289356 0.05937123457129 0.07672110590906
                209
                                 210
                                                   211
## 0.05318011504775 0.44633163042796 0.05305563922140 0.10695712520608
                213
                                 215
                                                   216
## 0.22731664890182 0.10499838074483 0.22699233986944 0.04014271233719
                                 222
##
                219
                                                   223
## 0.03763711685608 0.07828906169155 0.19879540298415 0.06026424071438
                225
                                 226
                                                   227
##
## 0.09382525047772 0.41091455191189 0.17067212276211 0.12539961092598
```

```
229
                                   230
                                                    232
                                                                       233
## 0.01978506548557 0.37058006076896 0.49390945980213 0.07420568010313
                 235
                                  236
                                                    239
  0.12907471726157 0.07437457571391 0.23947341470570 0.10251979085690
##
                 241
                                   242
  0.02943357983603 0.04263705998957 0.51691619260735 0.02678713546616
##
                 245
                                   246
                                                    247
## 0.00000003017757 0.05804212250376 0.04372673675503 0.08292451896189
                 250
                                   252
                                                    253
##
   0.09435366227674 \ 0.11462612894094 \ 0.08289780723434 \ 0.11677685312478
                 257
                                  258
                                                    259
   0.10032614974871 \ 0.09635566098727 \ 0.06978202854440 \ 0.10648478208047
                 261
                                  262
                                                    263
                                                                       264
   0.09356817262264 0.12680548187264 0.20818456676239 0.01576423397629
                 266
                                  267
                                                    269
   0.11535493263534 0.06128000163743 0.43576451991759 0.07984489843222
                 273
                                                    275
##
                                  274
   0.02230202388571 0.41999451425653 0.20356597494056 0.10505055988998
                 277
                                  278
                                                    279
                                                                      280
##
   0.09705389334045 0.27508844115992 0.01180600409412 0.07407335588394
##
                 281
                                  283
                                                    284
  0.10264864063729 0.04873923210506 0.26928116523875 0.06388203840381
                                                    291
                 287
                                   290
  0.09254474867135 0.06406821750420 0.11455213231342 0.27336997471499
##
                 293
                                  294
                                                    295
  0.0000006389220 0.06509009604345 0.47741328576458 0.07636393371293
                 297
                                  298
                                                    300
                                                                       301
##
   0.17254281532043 0.42284549434063 0.10994374876669 0.11498908401722
                 303
                                   304
                                                    307
  0.12468096553764 0.10591908133831 0.46492325055741 0.14453509626955
                 309
                                                    311
  0.09996889408641 \ 0.04053365163256 \ 0.01773746057543 \ 0.06082812565050
                 313
                                                    315
                                  314
  0.25535052937661 \ \ 0.10272562362140 \ \ 0.14997817028892 \ \ 0.02641509746546
                 318
                                  320
                                                    321
  0.20487322274666 0.01417719598015 0.28255336115798 0.47350115527576
##
  0.01953442970770 0.00254778627250 0.11465610503348 0.16216455439672
##
  0.18150490572783 \ 0.02849124076844 \ 0.02150322652745 \ 0.05413376574374
                 334
                                  335
                                                    337
  0.02149932970343 0.14150443803561 0.13355747787590 0.10663324416940
                 341
                                  342
                                                    343
  0.04299794296128 0.03604773087089 0.07184800609095 0.13447204579994
                 345
                                  346
                                                    347
  0.08462194148291 \ 0.70555223255473 \ 0.09561831659073 \ 0.24492785758741
##
                 349
                                   351
                                                    352
   0.13670004826959 0.09800005923959 0.05795964183228 0.12254079918661
                 355
                                  358
                                                    359
                                                                       360
   0.04948348015824 \ 0.12094718495846 \ 0.13721395957933 \ 0.03397388836053
##
                 361
                                  362
                                                    363
                                                                       364
  0.16493598512528 0.12280339148380 0.53222584638717 0.16912602404786
##
                 365
                                  366
                                                    368
## 0.25874635066273 0.14300748423268 0.66411444944080 0.00000011419521
```

```
372
                                                     375
                                                                       376
## 0.12595792407077 0.04402591469326 0.11266683290683 0.03982714301045
                 377
                                   378
                                                     379
  0.05678150779433 0.14163238654937 0.03899655426424 0.06929401485259
##
                 381
                                   382
##
  0.12241778502944 0.04888756800445 0.06115576250820 0.04252280752054
                                   388
  0.32327049537087 0.10275999610493 0.18181877493855 0.36654330584245
##
                 393
                                   394
                                                     395
   0.13683644729830 \ 0.09135026558376 \ 0.20088653648395 \ 0.29159761708000
                 397
                                   398
                                                     399
   0.11919093478561 \ 0.06944642322418 \ 0.11581904597456 \ 0.07667779253959
                 402
                                   403
                                                     405
   0.01631470057971 \ \ 0.15606184869614 \ \ 0.50119125524805 \ \ 0.00000002394177
                 409
                                   410
                                                     411
   0.38205128383486 \ 0.09021066081989 \ 0.28276131631235 \ 0.22794756364157
##
                                   414
                                                     415
   0.01825352858586 0.11937195266062 0.11012482583057 0.01378896411553
                 417
                                   419
                                                     420
   0.23218390591176 0.11905797454405 0.27641423184135 0.46311698334175
##
                                   426
  0.09388971140581 \ 0.17275300393597 \ 0.23700905220414 \ 0.02446807006557
##
                                   430
                                                     431
  0.17924887678855 0.59018029061858 0.07740267784206 0.15081919366784
                 433
                                   434
                                                     436
   0.07098532643904 \ 0.09679197227171 \ 0.09453581471099 \ 0.19922954165014
                 439
                                   440
                                                     443
##
   0.08804523017573 \ 0.22522234436123 \ 0.11608168137253 \ 0.01735552457869
                 445
                                   446
                                                     447
   0.02352048450610 0.07745347797396 0.55418152010673 0.29682518964275
##
  0.08791787452916 \ 0.16350494368727 \ 0.03470612157949 \ 0.27348909228699
                                                     457
   0.09568382380985 \ \ 0.11712897986983 \ \ 0.14461270422045 \ \ 0.03919259546345
                                   462
                                                     463
  0.02421439016999 0.07326006504666 0.08688704724772 0.57132307373833
##
## 0.14602055660648 0.22965991065836 0.05512701806522 0.05609302932677
## 0.08425276758985
#test model
confmatrix <- table(Actual_Value=train$Risk1Yr, Predicted_Value = response2 >0.5)
confmatrix
##
               Predicted_Value
## Actual_Value FALSE TRUE
              F
                   300
                          8
               Т
##
                    44
                          9
#accuracy
(confmatrix[[1,1]] + confmatrix[[2,2]])/sum(confmatrix)
```

## [1] 0.8559557

The accuracy is around 83-86% (depending on each time I run the code)

2a) Fit a logistic regression model to the binary-classifier-data.csv dataset

```
binary.classifier <- read.csv ("data/binary-classifier-data.csv", header = T,
                              stringsAsFactors = T)
binary_logistic <- glm(label ~ x + y, data = binary.classifier, family = binomial())</pre>
summary(binary logistic)
##
## Call:
## glm(formula = label ~ x + y, family = binomial(), data = binary.classifier)
## Deviance Residuals:
                    Median
##
      Min
                1Q
                                  ЗQ
                                           Max
## -1.3728 -1.1697 -0.9575
                             1.1646
                                        1.3989
##
## Coefficients:
##
               Estimate Std. Error z value Pr(>|z|)
## (Intercept) 0.424809
                          0.117224
                                    3.624
                                              0.00029 ***
## x
              -0.002571
                           0.001823 -1.411
                                              0.15836
## y
              -0.007956
                          0.001869 -4.257 0.0000207 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
##
      Null deviance: 2075.8 on 1497 degrees of freedom
## Residual deviance: 2052.1 on 1495 degrees of freedom
## AIC: 2058.1
## Number of Fisher Scoring iterations: 4
```

- 2b) The dataset (found in binary-classifier-data.csv) contains three variables; label, x, and y. The label variable is either 0 or 1 and is the output we want to predict using the x and y variables.
- b i) What is the accuracy of the logistic regression classifier?

```
library(caTools)

#split the data
split <- sample.split(binary.classifier, SplitRatio = 0.8)
split</pre>
```

```
## [1] TRUE FALSE TRUE
```

```
# Train model
train <- subset(binary.classifier, split == "TRUE")</pre>
test <- subset(binary.classifier, split == "FALSE")</pre>
mymodel <- glm(label ~ x + y, data = train, family = binomial())</pre>
summary(mymodel)
##
## Call:
## glm(formula = label ~ x + y, family = binomial(), data = train)
##
## Deviance Residuals:
##
       Min
                 1Q
                      Median
                                    3Q
                                            Max
## -1.3733 -1.1714 -0.9584
                                1.1637
                                         1.3962
##
## Coefficients:
                Estimate Std. Error z value Pr(>|z|)
##
                           0.143309
                                      2.973 0.002946 **
## (Intercept) 0.426096
## x
               -0.002613
                            0.002229 -1.172 0.241028
## y
               -0.007897
                            0.002279 -3.465 0.000531 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 1384.4 on 998 degrees of freedom
## Residual deviance: 1368.6 on 996 degrees of freedom
## AIC: 1374.6
## Number of Fisher Scoring iterations: 4
# Run test data through the model built on training data
response <- predict(mymodel, test, type = "response")</pre>
response
                     5
                                8
                                         11
                                                    14
                                                              17
## 0.3859912 0.3960389 0.3645816 0.3951573 0.3852205 0.4011745 0.3855940 0.3932055
          26
                    29
                               32
                                         35
                                                   38
                                                              41
## 0.3949579 0.4056216 0.4049576 0.4003668 0.3728320 0.3800139 0.3961871 0.3710153
          50
                    53
                               56
                                         59
                                                   62
                                                              65
                                                                        68
## 0.3872569 0.3776151 0.4957447 0.4887219 0.4913178 0.4836381 0.5079230 0.5046224
          74
                    77
                               80
                                         83
                                                   86
                                                              89
                                                                        92
## 0.4817965 0.4945914 0.5013435 0.4999467 0.4866470 0.4964539 0.5024918 0.4870026
                   101
                              104
                                        107
                                                             113
                                                                       116
##
          98
                                                   110
                                                                                  119
## 0.4804055 0.4328729 0.4313201 0.4344339 0.4288123 0.4319728 0.4323195 0.4339955
                   125
                              128
         122
                                        131
                                                   134
                                                             137
                                                                       140
                                                                                  143
## 0.4300306 0.4317361 0.4317655 0.4328597 0.4266003 0.4318488 0.4324747 0.4298351
         146
                   149
                              152
                                                                       164
                                        155
                                                   158
                                                             161
                                                                                  167
## 0.4290960 0.4290098 0.4314193 0.4304947 0.4342366 0.4176426 0.4197429 0.4275995
##
         170
                   173
                              176
                                        179
                                                   182
                                                             185
                                                                       188
## 0.4186166 0.4233980 0.4174152 0.4266393 0.4167182 0.4249673 0.4210912 0.4192237
         194
                   197
                              200
                                        203
                                                   206
                                                             209
                                                                       212
                                                                                  215
## 0.4049754 0.4792879 0.4768561 0.4813319 0.4868091 0.4853134 0.4849707 0.4770099
##
         218
                   221
                              224
                                        227
                                                  230
                                                             233
                                                                       236
                                                                                  239
```

```
## 0.4826103 0.4761161 0.3875148 0.3943895 0.3843406 0.3832096 0.3900469 0.3834756
        242
                  245
                             248
                                      251
                                                 254
                                                           257
                                                                     260
                                                                               263
## 0.3867952 0.3891775 0.3902499 0.3865047 0.3819999 0.3980086 0.5321373 0.5403128
                  269
        266
                             272
                                    275
                                                 278
                                                           281
                                                                     284
## 0.5409408 0.5334333 0.5422132 0.5343722 0.5336990 0.5396221 0.5380727 0.5398325
        290
                  293
                             296
                                     299
                                                 302
                                                           305
                                                                     308
## 0.5364732 0.5355689 0.5422642 0.5328465 0.5268907 0.5345019 0.5469757 0.5362850
         314
                  317
                             320
                                       323
                                                 326
                                                           329
                                                                     332
## 0.4968925 0.4797764 0.5049410 0.5000393 0.4944514 0.4854310 0.4970037 0.4999174
         338
                   341
                             344
                                       347
                                                 350
                                                           353
                                                                     356
## 0.4885124 0.4992897 0.4974317 0.4967731 0.4969057 0.4953977 0.4987310 0.4908739
                            368
                                                374
                                                                     380
                                   371
                                                           377
         362
                  365
## 0.4775854 0.4977646 0.5026842 0.5262028 0.5257620 0.5258954 0.5210544 0.5372159
                   389
                             392
                                                 398
         386
                                      395
                                                           401
                                                                     404
## 0.5402550 0.5233244 0.5284924 0.5206271 0.5311751 0.5266569 0.5279144 0.5233986
         410
                   413
                            416
                                      419
                                                 422
                                                           425
                                                                     428
## 0.5302377 0.5288050 0.5214824 0.5345700 0.5191388 0.5254279 0.5279576 0.5361113
         434
                   437
                             440
                                       443
                                                 446
                                                           449
                                                                     452
## 0.5317830 0.5355281 0.5234436 0.5295622 0.5329298 0.5278760 0.5354535 0.5312651
        458
                 461
                         464
                                   467
                                               470
                                                           473
                                                                     476
## 0.5310771 0.5329166 0.5284145 0.5274834 0.5246198 0.5265147 0.5340150 0.6056608
                  485
                             488
                                                494
                                                           497
                                      491
                                                                     500
## 0.5984664 0.6062299 0.6046665 0.5995475 0.6023632 0.6020556 0.6078977 0.5981586
                  509
                             512
                                   515
                                                518
                                                           521
                                                                     524
## 0.6011867 0.6025045 0.5956689 0.6001266 0.6020527 0.6088810 0.6034230 0.6045946
        530
                  533
                             536
                                      539
                                                542
                                                           545
                                                                     548
## 0.5980163 0.3983885 0.4079252 0.4202367 0.4190200 0.4127514 0.4129328 0.4064135
        554
                   557
                             560
                                       563
                                                 566
                                                           569
                                                                     572
## 0.4219478 0.4090297 0.3930576 0.4156397 0.4148572 0.4024722 0.3972185 0.4058054
        578
                   581
                             584
                                       587
                                                 590
                                                           593
                                                                     596
## 0.5524381 0.5365934 0.5403081 0.5390955 0.5511916 0.5306120 0.5453252 0.5403101
         602
                   605
                             608
                                      611
                                                 614
                                                           617
                                                                     620
## 0.5444483 0.5474996 0.5545737 0.5401801 0.5289206 0.5235348 0.5484274 0.5561264
                   629
                             632
                                      635
                                                 638
                                                           641
        626
                                                                     644
## 0.5350815 0.5653425 0.5508158 0.5616156 0.5558422 0.5519972 0.5474621 0.5381597
        650
                  653
                             656
                                      659
                                               662
                                                           665
                                                                     668
## 0.5484183 0.5429386 0.5505103 0.5483532 0.5577804 0.5401874 0.5373197 0.5428842
        674
                   677
                             680
                                      683
                                                686
                                                           689
                                                                     692
## 0.5376250 0.5439585 0.4764081 0.4755133 0.4704704 0.4926600 0.4979919 0.4823490
                  701
                             704
                                      707
                                                 710
        698
                                                           713
                                                                     716
## 0.4896090 0.4814499 0.4907054 0.4707298 0.4805548 0.4903115 0.3675379 0.3698687
                            728
                  725
                                      731
                                                734
                                                           737
                                                                     740
        722
## 0.3668638 0.3685135 0.3695959 0.3647919 0.3637691 0.3699229 0.3706318 0.3725848
                                                758
        746
                  749
                             752
                                      755
                                                           761
                                                                     764
## 0.3718419 0.3650360 0.3749430 0.3762284 0.3725508 0.3684195 0.3719492 0.3657416
        770
                   773
                             776
                                       779
                                                 782
                                                           785
                                                                     788
## 0.4660068 0.4561570 0.4682967 0.4700284 0.4577259 0.4686187 0.4538252 0.4489316
                             800
                                                 806
                                                           809
         794
                  797
                                       803
                                                                     812
## 0.4570607 0.4545511 0.4522061 0.4462537 0.4452177 0.4564325 0.4646372 0.4530587
        818
                  821
                             824
                                      827
                                                 830
                                                           833
                                                                     836
## 0.4369456 0.5045940 0.5096125 0.5172271 0.5153211 0.5249132 0.5154012 0.5239840
                  845
                             848
                                       851
                                                 854
                                                           857
                                                                     860
## 0.5092067 0.5204720 0.5163740 0.5146260 0.5133375 0.5041836 0.5198926 0.5201950
##
        866
                  869
                             872
                                       875
                                                 878
                                                           881
                                                                     884
```

```
## 0.4983237 0.5082385 0.5146224 0.5206785 0.5131874 0.5123260 0.5101830 0.5124617
                   893
                             896
                                       899
                                                  902
                                                            905
                                                                      908
         890
## 0.5115152 0.5118950 0.5061931 0.5087562 0.5116138 0.5162733 0.5113096 0.5110024
                   917
                             920
                                       923
                                                  926
                                                            929
                                                                      932
                                                                                 935
## 0.5155883 0.5149190 0.5173347 0.5141051 0.5142269 0.5146627 0.5078669 0.4358446
                                                  950
                                                            953
                                                                      956
         938
                   941
                             944
                                       947
## 0.4292347 0.4413323 0.4411157 0.4329710 0.4354809 0.4389980 0.4340057 0.4310356
                                                            977
         962
                             968
                   965
                                       971
                                                  974
                                                                      980
## 0.4415968 0.4339046 0.4349890 0.4371752 0.4362401 0.4369081 0.4394073 0.4327384
                                                  998
         986
                   989
                             992
                                       995
                                                           1001
                                                                     1004
## 0.4385131 0.4963421 0.5020834 0.5105756 0.5140703 0.5165107 0.5263053 0.5239384
                                                           1025
        1010
                  1013
                            1016
                                      1019
                                                1022
                                                                     1028
## 0.5147187 0.5227445 0.5308374 0.5321849 0.5155180 0.5114803 0.5191110 0.5063043
                                                 1046
                                                           1049
        1034
                  1037
                            1040
                                      1043
                                                                     1052
## 0.5071159 0.5129503 0.4447202 0.4442228 0.4469819 0.4481680 0.4450972 0.4471306
        1058
                  1061
                            1064
                                      1067
                                                 1070
                                                           1073
                                                                     1076
## 0.4464186 0.4484350 0.4447513 0.4489718 0.4392031 0.4532818 0.4461254 0.4462776
        1082
                  1085
                            1088
                                      1091
                                                 1094
                                                           1097
                                                                     1100
## 0.4484290 0.4491152 0.4475246 0.4455945 0.4405042 0.5069586 0.5128196 0.5097014
                  1109
                            1112
                                      1115
                                                1118
                                                           1121
                                                                     1124
## 0.5093772 0.5201489 0.5074769 0.5141027 0.5136608 0.5133996 0.5216232 0.5020295
                            1136
                  1133
                                      1139
                                                 1142
                                                           1145
## 0.5004828 0.5094412 0.4923586 0.5675762 0.5734224 0.5859596 0.5724519 0.5757550
                  1157
                            1160
                                      1163
                                                 1166
                                                           1169
                                                                     1172
## 0.5797703 0.5809403 0.5721488 0.5722358 0.5603580 0.5563542 0.5578435 0.5466480
        1178
                  1181
                            1184
                                      1187
                                                 1190
                                                           1193
                                                                     1196
## 0.5571230 0.5602274 0.5549665 0.5625068 0.5621504 0.5552410 0.5594843 0.5619397
        1202
                  1205
                            1208
                                      1211
                                                 1214
                                                           1217
                                                                     1220
## 0.5521228 0.5650269 0.5563361 0.5654721 0.5564195 0.5553650 0.5544891 0.5430253
                  1229
                            1232
                                      1235
                                                1238
                                                           1241
                                                                     1244
## 0.5495547 0.5408851 0.5437799 0.5492710 0.5417211 0.5487406 0.5436492 0.5515897
        1250
                  1253
                            1256
                                      1259
                                                 1262
                                                           1265
                                                                     1268
## 0.5465329 0.5446483 0.5445634 0.5443084 0.5427018 0.5454888 0.5418964 0.4493764
                                                                     1292
                  1277
                            1280
                                      1283
                                                 1286
                                                           1289
        1274
                                                                               1295
## 0.4472874 0.4705278 0.4339855 0.4458013 0.4492788 0.4368963 0.4392876 0.4304108
                                                1310
                  1301
                            1304
                                      1307
                                                           1313
                                                                     1316
        1298
## 0.4342595 0.4501813 0.4435494 0.4429924 0.4265215 0.4397452 0.4392524 0.4526399
                  1325
                            1328
                                      1331
                                                 1334
                                                           1337
                                                                     1340
## 0.4438767 0.4527497 0.4542619 0.4426558 0.4413256 0.4545698 0.4375310 0.4417152
                                      1355
                                                           1361
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## 0.5027224 0.5038217 0.5030609 0.5004273 0.5008079 0.5052552 0.5054742 0.5028868
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## 0.5039422 0.5041152 0.5030102 0.5022929 0.5047315 0.5050989 0.5024887 0.5037614
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## 0.5042951 0.5037544 0.5030761 0.5893090 0.5729919 0.5858901 0.5910814 0.5776580
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## 0.5772548 0.5717962 0.5831964 0.5741517 0.5897479 0.5809594 0.5884940 0.5621334
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## 0.5973905 0.5779546 0.5751907 0.5855627 0.5817025 0.3879685 0.3866495 0.3904260
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## 0.3966024 0.3838785 0.4001269 0.3911476 0.3908662 0.3965635 0.3970642 0.4001907
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## 0.3830210 0.3927241 0.4034568
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## 0.3974776 0.3787539 0.4042150 0.3905875 0.3851244 0.3790678 0.3825309 0.3632794
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## 0.3980652 0.3913016 0.3856918 0.3832828 0.3765523 0.3831049 0.3791941 0.3860717
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## 0.3955863 0.3976758 0.3957830 0.4007883 0.3830849 0.3897010 0.3702379 0.3762705
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## 0.3840291 0.3943154 0.3950854 0.3995468 0.3841011 0.4984761 0.4958341 0.4914926
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## 0.4834413 0.4887234 0.4933332 0.4865511 0.5050695 0.5025740 0.4878237 0.4989269
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## 0.5024680 0.4887376 0.5049085 0.4973009 0.5142832 0.4920542 0.5017492 0.4925627
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## 0.5404087 0.5399796 0.5382748 0.5424355 0.5470304 0.5392417 0.5409776 0.5393392
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## 0.5409557 0.5319930 0.5305024 0.5382818 0.5376973 0.5361509 0.5367508 0.5431438
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## 0.5285755 0.5242813 0.5318770 0.5235476 0.5245847 0.5214542 0.5328403 0.5241368
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## 0.5259355 0.5352867 0.5191320 0.5342886 0.5150841 0.5313838 0.5304574 0.5313495
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## 0.5269905 0.5292495 0.5359056 0.5278657 0.5383701 0.5270301 0.5306832 0.5275962
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## 0.5313928 0.5241466 0.5332429 0.5290349 0.5293302 0.5305984 0.5312034 0.5267228
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## 0.5341489 0.5318297 0.5346527 0.5272789 0.5257651 0.5313605 0.5312923 0.6040795
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## 0.6010802 0.5964636 0.5979642 0.5963562 0.6036749 0.6026069 0.6028827 0.5978958
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## 0.6044072 0.6058996 0.6057035 0.6035259 0.6063329 0.6082113 0.6087843 0.5998217
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## 0.5977827 0.6025216 0.6089426 0.6036002 0.6029552 0.6011948 0.6048720 0.6004289
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## 0.6105427 0.5969552 0.4179026 0.4056263 0.4044186 0.4075858 0.3939712 0.4080427
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## 0.4078146 0.4191878 0.4161155 0.4007440 0.4062981 0.4133761 0.3914074 0.4046830
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## 0.4055997 0.4055345 0.3977257 0.4047688 0.4318991 0.4208012 0.4020686 0.4088784
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## 0.4119978 0.4108328 0.3937173 0.4168112 0.4092756 0.4101725 0.4103471 0.5354565
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## 0.5408910 0.5442713 0.5356287 0.5409430 0.5481220 0.5542081 0.5574022 0.5352494
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## 0.5542696 0.5317819 0.5515333 0.5547753 0.5420223 0.5476976 0.5401680 0.5335694
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## 0.5435546 0.5538110 0.5494960 0.5492686 0.5575134 0.5455864 0.5386352 0.5395496
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## 0.5427632 0.5440608 0.5470795 0.5475726 0.5519934 0.5623326 0.5433734 0.5447509 ## 0.5587568 0.5562235 0.5503968 0.5450142 0.5466009 0.5448217 0.5459035 0.5577533 ## 0.5375981 0.5503014 0.5312456 0.5349704 0.5427704 0.5453060 0.5497238 0.5530662 ## 0.5490292 0.5432749 0.5480763 0.5519944 0.5639896 0.5484026 0.5424823 0.5523673 ## 0.5408220 0.5471387 0.5595111 0.4862211 0.4906933 0.4853480 0.4746213 0.4978203 ## 0.4765397 0.4991875 0.4878818 0.5094181 0.4937527 0.4951564 0.4858567 0.4964469 ## 0.5086752 0.4871646 0.4567130 0.5040533 0.4769064 0.4922655 0.4878954 0.5007688 ## 0.4942643 0.4986631 0.5014081 0.3721361 0.3662627 0.3748519 0.3729543 0.3676661 0.3678402 0.3736902 0.3702628 0.3672252 0.3655780 0.3682333 0.3650199 0.3698491 ## 0.3633374 0.3751306 0.3682578 0.3747839 0.3717150 0.3703235 0.3725400 0.3742863 ## 0.3734053 0.3733010 0.3727675 0.3673811 0.3751246 0.3722775 0.3687767 0.3701071 ## 0.3675110 0.3690086 0.3684452 0.3687034 0.3740228 0.3698537 0.3699355 0.4524078 0.4555276 0.4586439 0.4409412 0.4503468 0.4557291 0.4560452 0.4475006 0.4448394 ## 0.4480348 0.4478309 0.4589822 0.4461188 0.4608856 0.4605126 0.4623441 0.4657838 ## 0.4702893 0.4513142 0.4630644 0.4268114 0.4576293 0.4660786 0.4279882 0.4497459 ## 0.4532605 0.4516113 0.4529736 0.4501820 0.4556821 0.4558964 0.4652648 0.4718559  $0.4511703\ 0.5133175\ 0.5220783\ 0.5146538\ 0.5072693\ 0.5017354\ 0.5213691\ 0.5137955$ ## 0.5126214 0.5137699 0.5150587 0.5233744 0.5097207 0.5046026 0.5132890 0.5173449 ## 0.5162662 0.5169070 0.5159387 0.5175468 0.5111182 0.5218023 0.5113742 0.5080074 ## 0.5094744 0.5123610 0.5081899 0.5077451 0.5203210 0.5120229 0.5155758 0.5146093 ## 0.5082855 0.5199000 0.5003713 0.5212110 0.5143365 0.5138140 0.5142376 0.5157869 ## 0.5042313 0.5095284 0.5099486 0.5164223 0.5050643 0.5119163 0.5116185 0.5182555 ## 0.5154561 0.5140007 0.5120104 0.5152538 0.5110172 0.5092243 0.5065858 0.5093856 ## 0.5177277 0.5083413 0.5155870 0.5160984 0.5018868 0.5063977 0.5114067 0.5159521 ## 0.5095739 0.5094049 0.5175020 0.5127062 0.5133439 0.5134162 0.5042550 0.5114554 ## 0.5149932 0.5041380 0.5132570 0.5153014 0.5177943 0.5108492 0.5105303 0.4398007 ## 0.4377846 0.4375564 0.4345119 0.4355171 0.4336503 0.4342606 0.4411542 0.4409589

## 0.4352072 0.4415519 0.4376307 0.4302959 0.4344201 0.4311374 0.4329130 0.4350817 ## 0.4336920 0.4394301 0.4401092 0.4364468 0.4348312 0.4416925 0.4354754 0.4294884 ## 0.4413221 0.4378424 0.4363129 0.4340205 0.4303300 0.4346112 0.4381728 0.4362182 ## 0.4377815 0.5203862 0.5002090 0.5159360 0.5013110 0.5103471 0.5307189 0.5217882 ## 0.5185185 0.5126428 0.5154350 0.5094490 0.5210414 0.5127006 0.5126109 0.4949742 ## 0.5124289 0.5141379 0.5150193 0.5120019 0.5171419 0.5182207 0.5144647 0.5133585 ## 0.5068771 0.5135713 0.5078048 0.5090507 0.5099078 0.5034974 0.5090739 0.5083882 ## 0.5079582 0.5036299 0.5086121 0.5215262 0.5194718 0.4437361 0.4516685 0.4444647 ## 0.4447232 0.4461628 0.4446453 0.4390103 0.4465239 0.4457673 0.4444409 0.4461291 ## 0.4473565 0.4493539 0.4501463 0.4485107 0.4458615 0.4525426 0.4497248 0.4448586 ## 0.4431428 0.4392495 0.4503411 0.4458606 0.4466603 0.4486506 0.4457597 0.4438632 ## 0.4391552 0.4468551 0.4454116 0.4457365 0.4487615 0.4462525 0.4472775 0.4475444 ## 0.4463508 0.4431496 0.5187112 0.5053367 0.5102153 0.4974857 0.5058356 0.5125376 ## 0.5159905 0.5057028 0.5045748 0.5110698 0.5017723 0.5098720 0.5032433 0.5037871 ## 0.5062306 0.5009032 0.5142919 0.5124755 0.5154520 0.5213629 0.5086994 0.5090572 ## 0.5151279 0.5144613 0.5070648 0.5182845 0.5115687 0.5784825 0.5749911 0.5724733 ## 0.5792212 0.5768646 0.5739293 0.5667775 0.5697303 0.5764794 0.5686118 0.5738810 ## 0.5777644 0.5751339 0.5760284 0.5778742 0.5688223 0.5655969 0.5651348 0.5748882 ## 0.5622895 0.5500266 0.5622801 0.5659406 0.5615385 0.5582467 0.5568809 0.5681513 ## 0.5614064 0.5583595 0.5583369 0.5580008 0.5562871 0.5590965 0.5515574 0.5508173 ## 0.5595228 0.5570899 0.5613801 0.5600697 0.5566998 0.5649625 0.5603763 0.5678500 ## 0.5580536 0.5561712 0.5627620 0.5603517 0.5592234 0.5551922 0.5604823 0.5499071 ## 0.5575570 0.5558194 0.5581074 0.5550100 0.5526710 0.5565984 0.5485419 0.5491242 ## 0.5448571 0.5429472 0.5505126 0.5528905 0.5383592 0.5521365 0.5556768 0.5504943 ## 0.5470832 0.5469480 0.5429219 0.5429034 0.5472470 0.5425935 0.5485251 0.5492021 ## 0.5430687 0.5455694 0.5433413 0.5400665 0.5434511 0.5453855 0.5463484 0.5472258 ## 0.5405030 0.5497241 0.5475897 0.5450466 0.5469313 0.5519844 0.5510412 0.4219912

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## 0.4494935 0.4459278 0.4448352 0.4406397 0.4325286 0.4509195 0.4369082 0.4364415
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## 0.4291410 0.4345084 0.4430159 0.4462245 0.4377474 0.4420011 0.4416523 0.4394627
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## 0.5053887 0.5050715 0.5057054 0.5055479 0.5032952 0.5026788 0.5049743 0.5034991
##
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## 0.5020339 0.4997482 0.5012915 0.5021752 0.5015614 0.5058379 0.5046254 0.5015731
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## 0.5030140 0.5066838 0.5050578 0.5085634 0.5046472 0.5772172 0.5752386 0.5899658
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##
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##
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## 0.5791031 0.5887712 0.5990773 0.5916602 0.5647825 0.5643663 0.5753773 0.5778381
##
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                                                          1461
                                                                    1462
## 0.5956539 0.3846532 0.4017152 0.3962074 0.3942748 0.3887788 0.3880286 0.3934989
        1465
                  1467
                            1468
                                     1470
                                                1471
                                                          1473
                                                                    1474
## 0.3964731 0.3773319 0.3896646 0.3918171 0.3891806 0.4061555 0.3962011 0.3967610
        1477
                 1479
                           1480
                                     1482
                                               1483
                                                          1485
                                                                    1486
## 0.3909145 0.4087797 0.4055413 0.4112101 0.3978096 0.4075148 0.3986012 0.3987189
                 1491
                            1492
                                      1494
                                                1495
                                                          1497
                                                                    1498
## 0.3952515 0.4043356 0.3933863 0.3892234 0.3849731 0.3817636 0.3973745
confmatrix <- table(Actual_Value=train$label, Predicted_Value = response2 >0.5)
confmatrix
              Predicted_Value
## Actual_Value FALSE TRUE
             0
                  282 229
                  186 302
##
             1
(confmatrix[[1,1]] + confmatrix[[2,2]])/sum(confmatrix)
```

## [1] 0.5845846

The accuracy is around 58%