Assignment 1 - week 10

2022-05-22

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")
toracic <- read.csv ("csv_result-ThoraricSurgery.csv", stringsAsFactors = T)
head(toracic)</pre>
```

```
id DGN PRE4 PRE5 PRE6 PRE7
                                 PRE8 PRE9 PRE10 PRE11 PRE14 PRE17 PRE19 PRE25
## 1 1 DGN2 2.88 2.16 PRZ1 FALSE FALSE FALSE TRUE TRUE OC14 FALSE FALSE FALSE
    2 DGN3 3.40 1.88 PRZO FALSE FALSE FALSE FALSE FALSE
                                                        OC12 FALSE FALSE FALSE
     3 DGN3 2.76 2.08 PRZ1 FALSE FALSE FALSE TRUE FALSE
                                                         OC11 FALSE FALSE FALSE
     4 DGN3 3.68 3.04 PRZO FALSE FALSE FALSE FALSE FALSE
                                                        OC11 FALSE FALSE FALSE
## 5 5 DGN3 2.44 0.96 PRZ2 FALSE TRUE FALSE TRUE TRUE
                                                        OC11 FALSE FALSE FALSE
    6 DGN3 2.48 1.88 PRZ1 FALSE FALSE FALSE TRUE FALSE OC11 FALSE FALSE FALSE
    PRE30 PRE32 AGE Risk1Yr
## 1
     TRUE FALSE
                 60
                      FALSE
## 2
     TRUE FALSE
                51
                      FALSE
## 3 TRUE FALSE
                59
                      FALSE
## 4 FALSE FALSE
                 54
                      FALSE
## 5 TRUE FALSE
                73
                       TRUE
## 6 FALSE FALSE
                      FALSE
```

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.

glm(formula = Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7 + PRE8 +

PRE9 + PRE10 + PRE11 + PRE14 + PRE17 + PRE19 + PRE25 + PRE30 +

```
##
       PRE32 + AGE, family = binomial(), data = toracic)
##
##
  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
## DGNDGN8
                 18.032862 2399.545206
                                          0.008
                                                 0.99400
## PRE4
                  -0.227245
                               0.184911
                                          -1.229
                                                  0.21909
## PRE5
                 -0.030304
                               0.017858
                                         -1.697
                                                  0.08971
## PRE6PRZ1
                 -0.442715
                               0.519908
                                         -0.852
                                                 0.39448
## PRE6PRZ2
                 -0.293701
                               0.790690
                                         -0.371
                                                 0.71030
## PRE7TRUE
                  0.715341
                               0.555560
                                          1.288
                                                 0.19788
## PRESTRUE
                  0.174337
                               0.389186
                                          0.448
                                                 0.65419
## PRE9TRUE
                  1.368216
                               0.486768
                                          2.811
                                                 0.00494 **
## PRE10TRUE
                  0.576958
                               0.482570
                                          1.196
                                                  0.23185
## PRE11TRUE
                  0.516181
                               0.396480
                                          1.302
                                                 0.19295
## PRE140C12
                  0.439364
                               0.330092
                                          1.331
                                                 0.18318
## PRE140C13
                  1.179207
                               0.616546
                                          1.913
                                                 0.05580
## PRE140C14
                  1.652973
                               0.609362
                                          2.713
                                                 0.00668
## PRE17TRUE
                  0.926593
                               0.444462
                                          2.085
                                                 0.03709 *
## PRE19TRUE
                                         -0.009
                -14.655378 1653.541054
                                                 0.99293
## PRE25TRUE
                 -0.097894
                               1.003314
                                         -0.098
                                                 0.92227
## PRE30TRUE
                   1.083997
                               0.499030
                                          2.172
                                                  0.02984 *
## PRE32TRUE
                -13.983295 1645.313892
                                         -0.008
                                                 0.99322
## AGE
                  -0.009506
                               0.018099
                                         -0.525
                                                 0.59944
##
  Signif. codes: 0 '***' 0.001 '**' 0.01 '*' 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 far from zero (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(toracic, SplitRatio = 0.8)</pre>
split
   [1] FALSE FALSE
                     TRUE
                          TRUE
                                 TRUE TRUE TRUE TRUE FALSE TRUE TRUE TRUE
## [13]
        TRUE TRUE
                     TRUE
                           TRUE
                                 TRUE FALSE
#train model
train <- subset(toracic, split == "TRUE")</pre>
test <- subset(toracic, split == "FALSE")</pre>
mymodel <- glm(Risk1Yr ~ DGN + PRE4 + PRE5 + PRE6 + PRE7+ PRE8 + PRE9 + PRE10 + PRE11 + PRE14 + PRE17 +
                  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:
##
                      Median
       Min
                 1Q
                                   3Q
                                           Max
  -1.5643
           -0.5615
                    -0.4158
                             -0.2195
                                         2.5045
##
##
## Coefficients:
                 Estimate Std. Error z value Pr(>|z|)
##
## (Intercept) -16.64554 2399.54542 -0.007 0.99447
## DGNDGN2
                 14.68647 2399.54479
                                       0.006 0.99512
## DGNDGN3
                 13.99720 2399.54477
                                       0.006 0.99535
## DGNDGN4
                 14.66922 2399.54481
                                       0.006 0.99512
## DGNDGN5
                 16.67210 2399.54485
                                       0.007
                                              0.99446
## DGNDGN6
                  0.45080 2754.99730
                                       0.000 0.99987
## DGNDGN8
                 18.27003 2399.54524
                                       0.008
                                              0.99392
## PRE4
                 -0.16943
                             0.20712
                                      -0.818
                                               0.41336
## PRE5
                 -0.02335
                             0.01911
                                      -1.222 0.22177
## PRE6PRZ1
                 -0.01466
                             0.60994
                                      -0.024
                                              0.98082
## PRE6PRZ2
                  0.16268
                                       0.174
                             0.93685
                                              0.86215
## PRE7TRUE
                  0.54306
                             0.63031
                                       0.862
                                               0.38891
## PRESTRUE
                  0.10213
                             0.44769
                                       0.228
                                              0.81955
## PRE9TRUE
                  1.37408
                             0.53259
                                       2.580
                                               0.00988 **
## PRE10TRUE
                  0.45027
                             0.54445
                                       0.827
                                              0.40823
## PRE11TRUE
                  0.50486
                             0.45908
                                       1.100
                                               0.27146
## PRE140C12
                  0.41847
                             0.37858
                                       1.105 0.26900
## PRE140C13
                             0.65198
                                       1.710 0.08736 .
                  1.11457
                                       1.965 0.04937 *
## PRE140C14
                  1.38140
                             0.70287
```

```
## PRE17TRUE
                                 0.94823
                                                      0.48956
                                                                         1.937 0.05276 .
## PRE19TRUE
                              -14.74685 1661.22982
                                                                      -0.009 0.99292
## PRE25TRUE
                                -0.22012
                                                      1.03275
                                                                       -0.213
                                                                                      0.83122
                                                                                      0.01752 *
## PRE30TRUE
                                  1.46190
                                                      0.61536
                                                                         2.376
## PRE32TRUE
                              -13.71783 1644.35359
                                                                       -0.008
                                                                                      0.99334
                                -0.01761
                                                      0.02090
                                                                      -0.843
                                                                                      0.39942
## Signif. codes: 0 '***' 0.001 '**' 0.05 '.' 0.1 ' ' 1
##
     (Dispersion parameter for binomial family taken to be 1)
             Null deviance: 315.94 on 363 degrees of freedom
##
## Residual deviance: 264.38 on 339 degrees of freedom
## AIC: 314.38
##
## Number of Fisher Scoring iterations: 15
# Run test data through the model built on training data
response <- predict(mymodel, test, type = "response")</pre>
response
                                                                                                                                                       19
##
                                                              2
                                                                                            9
                                                                                                                        18
    0.5572035282960 0.0922951651095 0.1343515522998 0.1553448367814 0.1145932010920
                              20
                                                            27
                                                                                          36
                                                                                                                        37
##
     0.0482242512645 0.0810487513257 0.0663032553423 0.1190943855138 0.1715554536178
                                                            54
                                                                                          55
                                                                                                                        56
     0.1807137064961 0.1575162950288 0.1055447503226 0.1953388900788 0.0432346867017
                              72
                                                            73
                                                                                          74
                                                                                                                        81
     92
                                                                                          99
                                                                                                                       108
     0.1642770116514\ 0.0742319369909\ 0.0874785341533\ 0.1241346161845\ 0.0125904163372
                            110
                                                          117
                                                                                        126
                                                                                                                       127
     0.2962276592783 \ 0.2726698230812 \ 0.1083435482720 \ 0.0643020234939 \ 0.3008605639340
                                                                                        145
                                                                                                                       146
     0.0979951002869 \ \ 0.1538919706482 \ \ 0.2164371277500 \ \ 0.1063200498398 \ \ 0.0279730308349 
##
                            162
                                                          163
                                                                                        164
                                                                                                                       171
     0.0620621367912 0.1881142819939 0.0550568685103 0.0977151083978 0.2192512711323
                            181
                                                          182
                                                                                        189
                                                                                                                      198
     0.1700093495537 \ 0.0888951586716 \ 0.0806271409339 \ 0.0317598647801 \ 0.0419357189856
                            200
                                                          207
                                                                                        216
                                                                                                                       217
     0.2152735998557 0.0507731087395 0.2200081562311 0.2124834590851 0.0744373147128
                            225
                                                          234
                                                                                        235
                                                                                                                       236
    0.1109017242046 0.1369522601178 0.1319756655002 0.0985114178235 0.3119309258392
                                                                                        254
                                                                                                                       261
                            252
                                                          253
     0.1238353274400 \ \ 0.1037871209697 \ \ 0.1066226662638 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.0478097729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.0945177882404 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047809729265 \ \ 0.047
                            271
                                                          272
                                                                                        279
                                                                                                                       288
                                                                                                                                                     289
     0.1758398949292 \ 0.4162868946387 \ 0.0169203539581 \ 0.1197772368304 \ 0.3854526685884
                            290
                                                          297
                                                                                        306
                                                                                                                       307
##
     ##
                            315
                                                          324
                                                                                        325
                                                                                                                      326
     0.2139222346412 0.3909113429066 0.0779894811873 0.0181620814925 0.0623474844611
##
                            342
                                                          343
                                                                                        344
                                                                                                                       351
                                                                                                                                                     360
    0.0813283470213 0.1432258325224 0.1345933885795 0.1215189980520 0.0385893855105
##
                            361
                                                          362
                                                                                        369
                                                                                                                      378
                                                                                                                                                     379
```

```
## 0.1429726548403 0.1042522805262 0.0000001176598 0.0921943996364 0.0969703255678
##
               380
                               387
                                                396
                                                                397
                                                                                 398
  0.1292186196526 0.3192989775829 0.2976564341117 0.0424592144682 0.0959815325788
               405
                                               415
                                                                416
                               414
  0.2339942930473 0.1799839397491 0.1074784528870 0.0122548775227 0.0755065215475
               432
                               433
                                               434
  0.1146505888539 0.0340972750689 0.1134039143112 0.1769305535123 0.1429919688686
                               452
                                                459
## 0.0351662343847 0.2193641628952 0.0240636831643 0.0706064416879 0.1694064318303
## 0.0725068150332
```

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

```
5
                                                                        6
                  3
   0.09063580848228 \ 0.01347105631006 \ 0.15607747264160 \ 0.02725676473963
                                    8
                  7
                                                     10
  0.22473232469063 0.11479595145177 0.10478276843881 0.03835163536273
                 12
                                   13
                                                     14
  0.06706176194564 0.11849992861057 0.46197767892708 0.07788654189402
                 16
                                   17
                                                     21
  0.08996021178878 0.20085715459298 0.07541951986606 0.13986004269113
                 23
                                   24
                                                     25
  0.09122752664931 0.04946296944046 0.44932079694510 0.38368773287378
                                   29
                                                     30
  0.10999121981261 0.13821044682621 0.00000006463860 0.32127004094809
                                   33
                                                     34
  0.02810240949444 0.54690754763511 0.08449993311485 0.03290556087077
                                   40
  0.04945339866362 0.07391729415910 0.53846688918688 0.20421078465427
                                   44
                                                     46
  0.10548415210773 \ 0.72224452605492 \ 0.06228829532717 \ 0.09166212948992
                                   49
                                                     50
  0.10939588907137 0.18032437721492 0.01691607956622 0.02513570637712
                 52
                                                     57
  0.06234214820600 0.51646795664283 0.10086275263100 0.37214359736582
                 59
                                   60
                                                     61
   0.10386016611178 \ 0.07400750752948 \ 0.16527265424567 \ 0.17240574405150
                 64
                                   65
                                                     66
  0.03340312828508 0.23541610776732 0.03578612577919 0.02227855781478
                 68
                                   69
                                                     70
## 0.26939609332612 0.12801073383922 0.11643238094926 0.01556233753831
                                                     77
                 75
                                   76
   0.07074932306558 \ 0.32457904785860 \ 0.14808002489997 \ 0.11679041205013
                 79
                                   80
                                                     82
   0.15583402879006 \ 0.02335814876909 \ 0.31440248608989 \ 0.11620146799162
                 84
                                   85
                                                     86
   0.05252674604051 0.07815249367762 0.11362989729298 0.09542090152943
##
                 88
                                   89
                                                     93
## 0.22184318827168 0.70578964644836 0.11337808892824 0.03872210672917
                                   96
                                                     97
  0.17737962016691 0.07186929222516 0.19882399032708 0.00000010929646
                100
                                  101
                                                    102
                                                                      103
##
```

```
## 0.33018163335937 0.06597465315664 0.37822527625968 0.14110688650936
##
                104
                                 105
                                                   106
## 0.00000002758815 0.02481864846008 0.19438331632190 0.14559817764600
                111
                                 112
                                                   113
## 0.12962857038255 0.24162031624617 0.01898677158081 0.04851081503836
                115
                                 116
                                                   118
## 0.10135110776214 0.35177343372580 0.29964983196688 0.10136757841194
                120
                                 121
                                                   122
## 0.16531563815068 0.03651933895866 0.09087796532647 0.62117607443228
                124
                                 125
                                                   129
## 0.09004882664166 0.14180597629189 0.46439328540148 0.12886041775400
                131
                                 132
                                                   133
## 0.07658652963097 0.14237601218072 0.22804594058713 0.06487478678229
                136
                                 137
                                                   138
## 0.08255661079875 0.35278954714579 0.34975111907079 0.14209597448188
                                                   142
  0.02272863856038 0.17175285307577 0.09088572966963 0.01135216621702
                147
                                 148
                                                   149
## 0.01504772064031 0.11147094241269 0.08976431859295 0.04961581730028
                151
                                 152
                                                   154
## 0.02392240910583 0.07347273227117 0.13507101356302 0.10583814599847
                                 157
## 0.07956669526929 0.48704702848170 0.00000009824317 0.16859808059560
                                 161
                                                   165
## 0.10114789095708 0.01619551175819 0.43394940744110 0.40112959152093
                167
                                 168
                                                   169
## 0.21858014730065 0.10453559811414 0.15988010656069 0.24275979215796
                172
                                 173
                                                   174
## 0.31832505196130 0.48154129775307 0.09842084167740 0.16715408200671
                176
                                 177
                                                   178
## 0.29475759768255 0.32884835023883 0.12559660587703 0.19728208333790
                183
                                  184
                                                   185
  0.07811449684807 0.13339516345876 0.01559440801571 0.43455441985608
                187
                                 188
                                                   190
  0.07653040446295 0.14622489763911 0.11176158806414 0.00000010846706
                192
                                 193
                                                   194
  0.05991589772112 0.04898579152643 0.08089462095622 0.05368345209093
                196
                                 197
                                                   201
## 0.13989934461056 0.13374347515233 0.14375632841190 0.06879752986742
                203
                                 204
                                                   205
  0.38842261203575 0.14601311942631 0.01503824466478 0.08984813523195
                208
                                 209
                                                   210
## 0.08330194717972 0.05798819702106 0.38199578105271 0.04785089749926
                212
                                 213
                                                   214
  0.11693065190412 0.33939247229451 0.20801678265137 0.06660004211505
                                                   221
                219
                                  220
## 0.06005087728216 0.05059091980865 0.82020757404481 0.16187032329709
                223
                                 224
                                                   226
## 0.30959831256087 0.03852642009985 0.44298394841940 0.17791964055510
                228
                                 229
                                                   230
## 0.12499792973061 0.01448335354806 0.26415060306917 0.23893337079752
                                 233
                                                   237
## 0.69204421472005 0.08184332510122 0.15255592351745 0.07164343560372
##
                239
                                  240
                                                   241
                                                                     242
```

```
## 0.59522005542680 0.11465291117572 0.03623856098018 0.07744033224843
##
                244
                                                    246
                                  245
  0.05422186205360 0.00000003506174 0.08964960915920 0.08817051400347
                248
                                  249
                                                    250
  0.11383758557624 0.16651156446328 0.10972946819260 0.09626958754317
                255
                                  256
                                                    257
## 0.08205391105086 0.04705807480940 0.09490363834946 0.06379408588530
                259
                                  260
                                                    262
  0.08782039037998 0.08094507204348 0.12586425872710 0.09844860425335
                264
                                  265
                                                    266
  0.02207085742888 \ 0.08603087457340 \ 0.08350683281617 \ 0.09027539150261
                268
                                  269
                                                    273
## 0.33313017483104 0.48845296727667 0.02039980702145 0.41363772397122
                275
                                  276
                                                    277
  0.20416458364776 0.14904969634233 0.11157130639057 0.22618089950710
                280
                                  281
                                                    282
  0.08309188332708 \ 0.09549134228708 \ 0.01680844287405 \ 0.04469172255064
                284
                                  285
                                                    286
  0.24970800496155 0.06517908824567 0.07662682268455 0.17487773695735
                291
                                  292
                                                    293
  0.14882375138951 0.23200645423590 0.00000006389221 0.07123037716789
##
  0.32854885111217 0.10884635680472 0.45501812481847 0.10738213298818
                                  301
## 0.08240451414812 0.16224089295937 0.01973483388519 0.14030088255763
                304
                                  305
                                                    309
  0.15574181894752 0.06132934262298 0.09416903093999 0.08134689015454
                311
                                  312
                                                    313
  0.02343404344514 0.06157848398616 0.19534804826205 0.11421464213913
                316
                                                    318
                                  317
  0.23730524685362 0.03019266075500 0.30972866641361 0.08865742536446
##
                320
                                  321
                                                    322
                                                                      323
  0.01409693375754 \ 0.23270336666755 \ 0.07147288404033 \ 0.08365458900126
                327
                                  328
                                                    329
                                                                      330
  0.14815880749832 0.15830988080819 0.14958391899960 0.03526296873510
                331
                                  332
                                                    334
                                                                     335
  0.04853196318160 0.04821852466413 0.02554973322677 0.17173368697705
                                                    338
                336
                                  337
  0.08895978342403 0.14615454479616 0.18468180022443 0.04466023784703
##
                                  341
                                                    345
                340
  0.12792408371232 0.04344929427744 0.10443923457613 0.54421985831550
                347
                                  348
                                                    349
                                                                      350
  0.15654479842824 0.28552362354571 0.18401902082817 0.00629764142735
                352
                                  353
                                                    354
  0.07374738778541 0.01738407758714 0.07186003212042 0.06820071088381
                356
                                  357
                                                    358
  0.11930590590860 0.38743718054660 0.08540053819091 0.13057034600321
                363
                                  364
                                                    365
                                                                      366
  0.38638414097529 0.15720091586186 0.18423396867142 0.09257942323533
                367
                                  368
                                                    370
  0.08885983269135 \ 0.76807740556785 \ 0.07416162923259 \ 0.08744595246200
##
                372
                                  373
                                                    374
## 0.02576916888027 0.10797679427528 0.56580576898931 0.11874438046868
##
                376
                                  377
                                                    381
                                                                      382
```

```
## 0.05053582470427 0.07278632315921 0.09605481664009 0.04643333371028
##
                383
                                  384
                                                   385
                                                                     386
  0.09105084851606 0.02668828083558 0.03748919541363 0.24515399156960
                388
                                                   390
                                 389
##
  0.12939400959646 0.22864344874811 0.44237598890527 0.09966732534081
##
                392
                                 393
                                                   394
  0.29149854132662 0.30460548814116 0.10844025525141 0.25414644020656
##
                399
                                  400
                                                   401
## 0.13178707316029 0.08338843785561 0.01506854356884 0.01608968182534
##
                403
                                  404
                                                   406
  0.13961839829155 0.12532538480816 0.00000002685116 0.08410004389733
##
                408
                                  409
                                                   410
## 0.14581115693321 0.26950335686212 0.06164105956024 0.23749735112707
                                  413
                                                   417
## 0.27636972975956 0.01398443155041 0.21544113267099 0.06461944283458
##
                                  420
## 0.06810944614376 0.33006625611051 0.47374017792506 0.26368386260470
                                  425
                                                   426
## 0.02471251600305 0.24622740694646 0.14648161906047 0.25810297888199
                428
                                 429
                                                   430
##
  0.02933317609593 0.18282583607348 0.41643302394324 0.06942634883341
##
## 0.08870356965994 0.09228705800890 0.31004773411955 0.14152597030572
##
## 0.12467649393832 0.13538727909227 0.03019138385627 0.17529367009588
                                 445
                                                   446
## 0.02554329858335 0.01940266734933 0.05744954619360 0.55067920305490
                448
                                  449
                                                   453
## 0.29189472037175 0.07332324223041 0.29891579153749 0.12488388729086
                455
                                  456
                                                   457
## 0.04598376058761 0.19271642714725 0.13474556695074 0.06552371828647
##
                460
                                  461
                                                   462
## 0.02318797828216 0.04894944627807 0.05924461194728 0.11105872415270
                464
                                  465
                                                   466
                                                                     467
## 0.53887803260827 0.25073106897523 0.31795558989094 0.04877970241418
#test model
confmatrix <- table(Actual_Value=train$Risk1Yr, Predicted_Value = response2 >0.5)
##
               Predicted_Value
## Actual_Value FALSE TRUE
                  299
##
          FALSE
                         8
                         6
          TRUE
                   51
##
#accuracy
(confmatrix[[1,1]] + confmatrix[[2,2]])/sum(confmatrix)
```

[1] 0.8379121

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:
##
                1Q
                     Median
                                  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 ***
              -0.002571
                          0.001823 -1.411
                                             0.15836
## y
              -0.007956
                          0.001869 -4.257 0.0000207 ***
## ---
## Signif. codes: 0 '***' 0.001 '**' 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 TRUE FALSE

```
# Train model
train <- subset(binary.classifier, split == "TRUE")
test <- subset(binary.classifier, split == "FALSE")
mymodel <- glm(label ~ x + y, data = train, family = binomial())
summary(mymodel)</pre>
```

```
##
## Call:
## glm(formula = label ~ x + y, family = binomial(), data = train)
## Deviance Residuals:
                      Median
##
       Min
                 1Q
                                    3Q
                                            Max
## -1.3766 -1.1693 -0.9522
                                1.1648
                                         1.3896
##
## Coefficients:
##
                Estimate Std. Error z value Pr(>|z|)
  (Intercept) 0.433172
                            0.143853
                                       3.011 0.002602 **
               -0.002722
                            0.002231
                                     -1.220 0.222475
## x
## y
               -0.008017
                            0.002286
                                     -3.507 0.000453 ***
## ---
## Signif. codes: 0 '*** 0.001 '** 0.01 '* 0.05 '.' 0.1 ' 1
## (Dispersion parameter for binomial family taken to be 1)
##
       Null deviance: 1384.3 on 998 degrees of freedom
## Residual deviance: 1368.0 on 996 degrees of freedom
## AIC: 1374
## Number of Fisher Scoring iterations: 4
# Run test data through the model built on training data
response <- predict(mymodel, test, type = "response")</pre>
response
                                                    15
                                                                                   24
##
                     6
                                9
                                         12
                                                              18
                                                                         21
## 0.3759251 0.3879318 0.3762594 0.3603081 0.3886800 0.3805846 0.3804240 0.3834556
          27
                    30
                                         36
                               33
                                                    39
                                                              42
                                                                         45
## 0.3803084 0.3876246 0.3880340 0.3873913 0.3951783 0.3982624 0.3871152 0.3733111
##
          51
                    54
                               57
                                         60
                                                    63
                                                              66
                                                                         69
## 0.3917231 0.3970926 0.4977551 0.4906684 0.4959108 0.4893077 0.4879139 0.4965887
          75
                    78
                               81
                                         84
                                                    87
                                                              90
                                                                        93
##
## 0.4878604 0.4856685 0.5019209 0.4982379 0.4878841 0.4965857 0.4912688 0.4917554
                   102
                                        108
##
          99
                              105
                                                   111
                                                             114
                                                                       117
## 0.4284457 0.4331532 0.4264397 0.4313563 0.4265370 0.4326893 0.4329840 0.4257473
                   126
                              129
         123
                                        132
                                                   135
                                                             138
                                                                       141
                                                                                  144
## 0.4283440 0.4340988 0.4295015 0.4302586 0.4284559 0.4292098 0.4292381 0.4337705
         147
                   150
                              153
                                        156
                                                   159
                                                             162
                                                                       165
## 0.4297339 0.4283865 0.4314454 0.4358641 0.4266400 0.4160415 0.4182399 0.3972755
##
         171
                   174
                              177
                                        180
                                                   183
                                                             186
                                                                       189
## 0.4308150 0.4260458 0.4268041 0.4101690 0.4115315 0.4280241 0.4291229 0.4159474
         195
                   198
                              201
                                        204
                                                   207
                                                             210
                                                                       213
                                                                                  216
  0.4228222\ 0.4751448\ 0.4804512\ 0.4792266\ 0.4793031\ 0.4782142\ 0.4777298\ 0.4834663
         219
                   222
                              225
                                        228
                                                   231
                                                             234
                                                                       237
                                                                                  240
## 0.4853233 0.4790865 0.3783786 0.3798934 0.3830102 0.3874447 0.3934881 0.3809320
                                                             258
         243
                   246
                              249
                                        252
                                                   255
                                                                       261
## 0.3719944 0.3862471 0.3922618 0.3917158 0.3863231 0.3834871 0.5349157 0.5364307
                   270
                              273
                                        276
                                                   279
                                                             282
                                                                       285
## 0.5400589 0.5286853 0.5315987 0.5382596 0.5403910 0.5405918 0.5344848 0.5457080
                              297
                                        300
                                                   303
                                                             306
                   294
## 0.5400325 0.5424251 0.5392793 0.5393410 0.5317313 0.5382559 0.5360390 0.5431748
```

0.4781533 0.4919731 0.4996332 0.4928517 0.4971080 0.5011557 0.5108979 0.4867297 ## 0.4842046 0.4990104 0.4898526 0.4995049 0.4856019 0.4994755 0.4971667 0.5044316 ## 0.4940656 0.4871143 0.4902709 0.5355827 0.5298816 0.5117149 0.5199200 0.5254202 ## 0.5232588 0.5224993 0.5204103 0.5231727 0.5260946 0.5192293 0.5217999 0.5180077 ## 0.5285876 0.5323015 0.5385725 0.5213860 0.5344383 0.5334321 0.5316040 0.5315818 ## 0.5294228 0.5280224 0.5271502 0.5275803 0.5344200 0.5290268 0.5312093 0.5255699 ## 0.5242509 0.5292141 0.5308280 0.5267761 0.5320783 0.5273445 0.5315389 0.6057008 ## 0.5979691 0.5977727 0.6041975 0.5993380 0.6105535 0.6045713 0.5992369 0.6075012 0.6076527 0.6051625 0.6099629 0.6013357 0.6042198 0.6052432 0.6029044 0.6019054 ## 0.5984506 0.4028166 0.4047917 0.4052144 0.4165304 0.3978215 0.4106311 0.4018294 ## 0.4027067 0.4019438 0.4181489 0.4060528 0.4080786 0.4141198 0.4074091 0.5355953 ## 0.5446486 0.5412200 0.5547314 0.5354743 0.5387985 0.5343285 0.5361446 0.5429478 ## 0.5317759 0.5553215 0.5480239 0.5337018 0.5542631 0.5497007 0.5457889 0.5400325 ## 0.5445657 0.5482593 0.5633116 0.5452805 0.5570026 0.5457063 0.5454597 0.5585453 ## 0.5509603 0.5354166 0.5459041 0.5537582 0.5438715 0.5527058 0.5489607 0.5531023 ## 0.5478116 0.4861125 0.4852430 0.4978369 0.4992851 0.5096921 0.4952194 0.4964920 ## 0.4870347 0.5042360 0.4922333 0.5009105 0.4986902 0.3687837 0.3715987 0.3643062 ## 0.3703486 0.3638725 0.3648493 0.3664918 0.3718830 0.3714932 0.3670074 0.3710377 ## 0.3700206 0.3640017 0.3689409 0.3668169 0.3657023 0.3653252 0.3665334 0.4514893 ## 0.4578861 0.4494197 0.4552486 0.4437979 0.4468167 0.4451481 0.4596802 0.4650495 ## 0.4502552 0.4254813 0.4653714 0.4488427 0.4506995 0.4492895 0.4550560 0.4713169 ## 0.5128502 0.5141292 0.5011095 0.5133919 0.5133898 0.5230780 0.5038577 0.5170379 ## 0.5165827 0.5171037 0.5214666 0.5074467 0.5118569 0.5071729 0.5115061 0.5140853 ## 0.5196487 0.5209220 0.5134258 0.5154210 0.5093215 0.5163681 0.5117633 0.5182168 ## 0.5138531 0.5151923 0.5090732 0.5091237 0.5080872 0.5160435 0.5061435 0.5159471 ## 0.5092250 0.5125494 0.5133489 0.5112921 0.5037944 0.5151996 0.5106681 0.4374903 ## 0.4351825 0.4330298 0.4318589 0.4386431 0.4392569 0.4277619 0.4286376 0.4326274

```
##
         963
                   966
                             969
                                       972
                                                 975
                                                            978
                                                                      981
                                                                                984
## 0.4370458 0.4339982 0.4394720 0.4269409 0.4354623 0.4315448 0.4321496 0.4339641
         987
                   990
                             993
                                       996
                                                  999
                                                           1002
                                                                     1005
## 0.5203639 0.5159063 0.5102036 0.5217693 0.5125206 0.5093020 0.5126438 0.4944151
                            1017
                  1014
                                      1020
                                                 1023
                                                           1026
                                                                     1029
## 0.5141504 0.5118590 0.5179853 0.5133432 0.5135419 0.5088448 0.5032827 0.5082036
                  1038
                            1041
                                      1044
                                                1047
                                                           1050
                                                                     1053
## 0.5032526 0.5215891 0.4419355 0.4426796 0.4443811 0.4371138 0.4440033 0.4443615
        1059
                  1062
                            1065
                                      1068
                                                 1071
                                                           1074
                                                                     1077
## 0.4476324 0.4467899 0.4508856 0.4430781 0.4373560 0.4440747 0.4469026 0.4420452
                  1086
                            1089
                                      1092
                                                 1095
                                                           1098
                                                                     1101
## 0.4450921 0.4439696 0.4445176 0.4458106 0.4413506 0.5042614 0.4963236 0.5116653
        1107
                  1110
                            1113
                                      1116
                                                 1119
                                                           1122
                                                                     1125
## 0.5046774 0.5101099 0.5088977 0.5027445 0.4997788 0.5115624 0.5205886 0.5081123
                            1137
        1131
                  1134
                                      1140
                                                1143
                                                           1146
                                                                     1149
## 0.5135690 0.5174515 0.5791643 0.5728691 0.5773887 0.5671223 0.5769216 0.5743320
        1155
                  1158
                            1161
                                      1164
                                                 1167
                                                           1170
                                                                     1173
  0.5756164 0.5784841 0.5659537 0.5753591 0.5496630 0.5659962 0.5581080 0.5683611
                  1182
                                      1188
        1179
                            1185
                                                1191
                                                           1194
                                                                     1197
## 0.5582918 0.5578369 0.5588501 0.5504417 0.5569355 0.5599636 0.5649937 0.5679498
        1203
                  1206
                            1209
                                      1212
                                                1215
                                                           1218
                                                                     1221
## 0.5560452 0.5601817 0.5549813 0.5495683 0.5556924 0.5547073 0.5564430 0.5491286
                            1233
                  1230
                                      1236
                                                 1239
                                                           1242
                                                                     1245
        1227
## 0.5427869 0.5529032 0.5521361 0.5505112 0.5469317 0.5427017 0.5424738 0.5491103
                  1254
                                      1260
        1251
                            1257
                                                 1263
                                                           1266
                                                                     1269
## 0.5454126 0.5398426 0.5452583 0.5471607 0.5497248 0.5449119 0.5520002 0.4203500
                                                1287
        1275
                  1278
                            1281
                                      1284
                                                           1290
                                                                     1293
## 0.4446212 0.4392157 0.4497405 0.4349831 0.4247330 0.4502631 0.4404951 0.4409248
                            1305
                  1302
        1299
                                      1308
                                                1311
                                                           1314
                                                                     1317
## 0.4330532 0.4449276 0.4407028 0.4380912 0.4333370 0.4359702 0.4384942 0.4405152
        1323
                  1326
                            1329
                                      1332
                                                 1335
                                                           1338
                                                                     1341
## 0.4245140 0.4548126 0.4494832 0.4409753 0.4656618 0.4382152 0.4349335 0.5014863
        1347
                  1350
                            1353
                                      1356
                                                 1359
                                                           1362
                                                                     1365
## 0.5019877 0.5045514 0.5063485 0.5015471 0.5051492 0.5055828 0.5026488 0.5035456
                  1374
                            1377
                                      1380
                                                1383
                                                           1386
                                                                     1389
        1371
## 0.5037541 0.5055748 0.5012976 0.5023062 0.4996660 0.5021183 0.5058626 0.5015256
                  1398
                            1401
                                      1404
                                                1407
                                                           1410
## 0.5067994 0.5086767 0.5783591 0.5912792 0.5934422 0.6017101 0.5852427 0.5872956
                  1422
                            1425
                                      1428
                                                 1431
                                                           1434
## 0.5801924 0.5786552 0.5842055 0.5905802 0.5790214 0.5749042 0.5989092 0.5861005
                  1446
                            1449
                                      1452
                                                1455
                                                           1458
## 0.5900009 0.5929962 0.5652120 0.5790135 0.3824292 0.3941124 0.3867306 0.3916119
                            1473
        1467
                  1470
                                      1476
                                                1479
                                                           1482
                                                                     1485
## 0.3751615 0.3897993 0.4042961 0.3948631 0.4071013 0.4094830 0.4058178 0.3967480
                  1494
## 0.4025877 0.3872978 0.3795534
```

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

```
## 1 2 4 5 7 8 10 11
## 0.3949328 0.3832330 0.4018326 0.3935051 0.3824208 0.3615231 0.3798253 0.3926425
## 13 14 16 17 19 20 22 23
## 0.3955751 0.3824947 0.3830227 0.3987687 0.3736955 0.3829191 0.3763881 0.3906611
```

```
26
                              28
                                    29 31
                                                            32
## 0.3755182 0.3924209 0.3844012 0.4032784 0.3978168 0.4024929 0.3965417 0.3978991
         37
                    38
                              40
                                       41
                                                  43
                                                            44
                                                                       46
## 0.3930543 0.3698149 0.3933227 0.3772952 0.3803579 0.3937219 0.3674057 0.3681025
                    50
                              52
                                       53
                                                  55
                                                            56
                                                                       58
## 0.3813040 0.3846164 0.3925642 0.3748174 0.3813768 0.4949918 0.4950731 0.4878334
          61
                    62
                              64
                                        65
                                                  67
                                                             68
## 0.4991118 0.4904990 0.4857256 0.4826751 0.4945614 0.5073438 0.4892140 0.5040088
          73
                    74
                              76
                                        77
                                                  79
                                                             80
                                                                       82
## 0.4824818 0.4808545 0.4925839 0.4938167 0.5044622 0.5006716 0.4870091 0.4992546
          85
                    86
                              88
                                        89
                                                  91
                                                             92
                                                                       94
## 0.5018080 0.4857640 0.5043364 0.4956992 0.5138259 0.5018618 0.5010675 0.4860828
          97
                    98
                             100
                                       101
                                                 103
                                                           104
                                                                      106
## 0.4792706 0.4794022 0.4306624 0.4312333 0.4311090 0.4297186 0.4281018 0.4328789
         109
                   110
                             112
                                       113
                                                 115
                                                           116
                                                                      118
## 0.4263720 0.4271265 0.4302060 0.4303334 0.4277350 0.4307463 0.4362848 0.4323965
         121
                   122
                             124
                                       125
                                                 127
                                                            128
                                                                      130
## 0.4289680 0.4283531 0.4281750 0.4300878 0.4331159 0.4301545 0.4289397 0.4312374
                                                139
         133
                   134
                             136
                                       137
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## 0.4275757 0.4248151 0.4298208 0.4302374 0.4263916 0.4308474 0.4317580 0.4282251
                                                           152
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## 0.4314541 0.4274327 0.4283752 0.4273823 0.4313305 0.4297906 0.4276060 0.4288535
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## 0.4316947 0.4326818 0.4304161 0.4149385 0.4182115 0.4171020 0.4175687 0.4250522
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## 0.4207029 0.4159082 0.4200245 0.4208191 0.4200157 0.4147780 0.4193453 0.4240922
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         181
## 0.4014033 0.4140716 0.4266556 0.4224250 0.4166161 0.4184957 0.4037141 0.4166027
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## 0.4131086 0.4021190 0.4087543 0.4788734 0.4819210 0.4763922 0.4789059 0.4810053
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## 0.4831429 0.4865369 0.4829758 0.4850963 0.4709206 0.4847117 0.4759906 0.4765690
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## 0.4792958 0.4821704 0.4776441 0.4755997 0.3806483 0.3850293 0.3825810 0.3920251
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                                                 235
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         229
## 0.3890732 0.3818402 0.3851281 0.3806852 0.3740374 0.3875991 0.3916037 0.3810097
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                                       245
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## 0.3921902 0.3842503 0.3929662 0.3867183 0.3789030 0.3877849 0.3887562 0.3839991
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                                       257
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                                                                      262
## 0.3987371 0.3794339 0.3904267 0.3956572 0.3818044 0.5319668 0.5327923 0.5403521
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                                       269
                                                 271
                                                            272
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## 0.5385980 0.5409463 0.5392145 0.5332963 0.5379006 0.5422480 0.5355240 0.5342959
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                                       281
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                                                                      286
## 0.5416710 0.5335092 0.5371781 0.5396025 0.5370016 0.5381011 0.5356304 0.5398251
                   290
                             292
                                       293
                                                 295
                                                            296
                                                                      298
## 0.5404480 0.5364096 0.5382948 0.5354666 0.5471507 0.5424300 0.5410705 0.5326922
         301
                   302
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                                                 307
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                                                                      310
## 0.5410180 0.5265307 0.5302750 0.5344218 0.5376454 0.5470972 0.5367035 0.5363007
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                                       317
                                                 319
                                                            320
                                                                      322
## 0.5420604 0.4969258 0.4943127 0.4794708 0.4927974 0.5050164 0.4940169 0.5000256
                             328
                                       329
                                                            332
         325
                   326
                                                 331
                                                                      334
## 0.4893073 0.4942973 0.4873740 0.4852105 0.4981101 0.4968300 0.4907778 0.4998607
         337
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                                       341
                                                 343
                                                            344
                                                                      346
## 0.4969522 0.4883828 0.4966645 0.4994082 0.4961866 0.4974362 0.4910979 0.4966651
```

0.5007094 0.4968455 0.4964591 0.4953198 0.4969323 0.4986575 0.5055167 0.4906961 ## 0.5022274 0.4771473 0.4931284 0.4977115 0.4983962 0.5027514 0.5296925 0.5252339 ## 0.5277365 0.5247817 0.5135726 0.5249212 0.5325974 0.5199710 0.5378812 0.5363968 ## 0.5276444 0.5395193 0.5310091 0.5223436 0.5236136 0.5275703 0.5319652 0.5195585 ## 0.5347863 0.5302406 0.5228004 0.5257719 0.5308432 0.5268886 0.5358409 0.5223876 ## 0.5245824 0.5293207 0.5317191 0.5278771 0.5341854 0.5204852 0.5276703 0.5336842 ## 0.5250074 0.5180801 0.5180969 0.5244479 0.5138827 0.5280444 0.5306808 0.5365321 ## 0.5270490 0.5319319 0.5362349 0.5357930 0.5388290 0.5235062 0.5308380 0.5297318 0.5330397 0.5332180 0.5277620 0.5279925 0.5285936 0.5357751 0.5252268 0.5314995 ## 0.5316317 0.5312576 0.5335044 0.5331309 0.5295053 0.5285193 0.5315386 0.5276176 ## 0.5344658 0.5246220 0.5349569 0.5265455 0.5258179 0.5342286 0.5315178 0.6072759 ## 0.6026642 0.5999448 0.5994928 0.6080223 0.6053104 0.6063108 0.6044811 0.6010319 0.6103073 0.6039885 0.6030042 0.6036478 0.6091551 0.6096832 0.6041591 0.5996555 ## 0.6060302 0.6027333 0.6072939 0.6040969 0.6080608 0.5971243 0.6106046 0.6016425 ## 0.5993246 0.6036343 0.6107303 0.6106172 0.6045696 0.6050802 0.6065609 0.6062683 ## 0.6123040 0.5994852 0.4152261 0.3954202 0.4015101 0.4051506 0.3909471 0.4176015 ## 0.4027314 0.4193349 0.3947869 0.4062397 0.4293802 0.3900437 0.3991666 0.4128975 ## 0.4092111 0.4121411 0.3907438 0.3995865 0.4064727 0.3942348 0.4075609 0.4029933 0.5410285 0.5527611 0.5356886 0.5367612 0.5484544 0.5404568 0.5578983 0.5392661 ## 0.5335523 0.5515436 0.5324080 0.5305818 0.5507711 0.5456672 0.5453444 0.5405202 ## 0.5547043 0.5447046 0.5518690 0.5478225 0.5422418 0.5550277 0.5404160 0.5403255 ## 0.5438254 0.5290376 0.5497623 0.5233637 0.5579525 0.5487118 0.5388251 0.5565421 ## 0.5433299 0.5355251 0.5476348 0.5662053 0.5526978 0.5514506 0.5440042 0.5624445 0.5595490 0.5566558 0.5510851 0.5527451 0.5472593 0.5480603 0.5465096 0.5386237 ## 0.5380825 0.5490269 0.5316384 0.5435529 0.5433151 0.5511725 0.5503968 0.5490364 ## 0.5496869 0.5585909 0.5486590 0.5407357 0.5649786 0.5378179 0.5431100 0.5434361

0.5414101 0.5381472 0.5603044 0.5444815 0.4907423 0.4761042 0.4743342 0.4751860 ## 0.4762412 0.4700476 0.4877951 0.4926129 0.4937898 0.4979467 0.4856305 0.4822361 ## 0.5089530 0.4895749 0.4562138 0.4811994 0.4766171 0.4906199 0.4878345 0.4704007 ## 0.4943302 0.4803869 0.5015713 0.4902576 0.3628298 0.3641769 0.3696246 0.3665605 $0.3644836\ 0.3635132\ 0.3669579\ 0.3652323\ 0.3622194\ 0.3662492\ 0.3616362\ 0.3613582$ ## 0.3599477 0.3603457 0.3649218 0.3666498 0.3684200 0.3672937 0.3692280 0.3693155 ## 0.3701458 0.3684680 0.3694649 0.3616724 0.3718737 0.3716970 0.3654689 0.3729871 ## 0.3641434 0.3692329 0.3651059 0.3650896 0.3708180 0.3686554 0.3666239 0.3622690 0.4546885 0.4652957 0.4398152 0.4554534 0.4549964 0.4676303 0.4464818 0.4692728 ## 0.4469854 0.4569798 0.4582514 0.4679556 0.4601907 0.4529448 0.4616410 0.4479182 ## 0.4697006 0.4561118 0.4623683 0.4536968 0.4568262 0.4513814 0.4267167 0.4452940 ## 0.4522665 0.4441322 0.4521284 0.4556245 0.4548303 0.4639234 0.4645147 0.4521669 0.4502507 0.4357222 0.5217346 0.5039961 0.5067370 0.5090408 0.5210514 0.5168629 ## 0.5119685 0.5148143 0.5146597 0.5247341 0.5094220 0.5149665 0.5127439 0.5237595 ## 0.5158960 0.5087074 0.5157084 0.5202350 0.5106190 0.5160245 0.5108001 0.5141053 ## 0.5089327 0.5128709 0.5074872 0.5034129 0.5199122 0.5196080 0.5150296 0.5199255 0.5077032 0.4975373 0.4996686 0.5076212 0.5137938 0.5143264 0.5139692 0.5203029 ## 0.5038184 0.5130050 0.5098425 0.5121063 0.5047283 0.5100108 0.5114620 0.5122934 ## 0.5153931 0.5113478 0.5118308 0.5116789 0.5107693 0.5059449 0.5062725 0.5085166 ## 0.5176895 0.5114340 0.5154758 0.5162015 0.5015526 0.5111652 0.5111937 0.5107995 ## 0.5093129 0.5156234 0.5173468 0.5148646 0.5131882 0.5171719 0.5039791 0.5139932 ## 0.5149582 0.5141331 0.5131055 0.5146487 0.5177787 0.5075919 0.5103415 0.4333998 ## 0.4353909 0.4267121 0.4320977 0.4390873 0.4311614 0.4388533 0.4389035 0.4305105 ## 0.4327879 0.4330372 0.4352702 0.4366845 0.4319761 0.4315462 0.4304543 0.4285112 ## 0.4312619 0.4393649 0.4377672 0.4314644 0.4323807 0.4326218 0.4330045 0.4348196 ## 0.4390415 0.4338440 0.4339745 0.4345294 0.4277710 0.4371863 0.4358073 0.4302549 ## 0.4354139 0.4361539 0.4998100 0.4959027 0.5009834 0.5018161 0.5309673 0.5103205

0.5183814 0.5140444 0.5154477 0.5163942 0.5209990 0.5264277 0.5125030 0.5240961 ## 0.5122592 0.5146268 0.5148832 0.5228784 0.5170461 0.5310419 0.5143986 0.5324625 ## 0.5066424 0.5153571 0.5074272 0.5114604 0.5099107 0.5191302 0.5089211 0.5061136 ## 0.5076745 0.5068399 0.5082718 0.5128072 0.5194413 0.4429219 0.4499757 0.4424198 ## 0.4429606 0.4452453 0.4428343 0.4464130 0.4447639 0.4433096 0.4426754 0.4453636 ## 0.4456154 0.4446494 0.4484314 0.4466869 0.4441032 0.4429487 0.4480041 0.4472577 ## 0.4413263 0.4373058 0.4486250 0.4516246 0.4448917 0.4443751 0.4439898 0.4445077 ## 0.4372686 0.4466831 0.4436563 0.4474252 0.4470183 0.4458126 0.4455506 0.4438130 ## 0.4445773 0.4386419 0.5179461 0.5059542 0.5092757 0.5118467 0.5047784 0.5087603 ## 0.5151179 0.5084437 0.5035050 0.5193482 0.5006387 0.5064728 0.5021171 0.5132096 ## 0.5052209 0.5127490 0.5133953 0.5124815 0.5145986 0.5208898 0.5076679 0.5009201 ## 0.5142738 0.4993592 0.5060822 0.5084461 0.5106395 0.4911079 0.5754390 0.5677510 ## 0.5798536 0.5739149 0.5744391 0.5866808 0.5701058 0.5728151 0.5689041 0.5761935 ## 0.5783238 0.5803431 0.5765233 0.5816743 0.5692104 0.5725657 0.5653827 0.5726892 ## 0.5621726 0.5601971 0.5621774 0.5561585 0.5614104 0.5577799 0.5567065 0.5462302 ## 0.5613783 0.5569921 0.5582051 0.5602145 0.5560752 0.5547277 0.5511946 0.5624648 ## 0.5594457 0.5621548 0.5612391 0.5550416 0.5565302 0.5593322 0.5603595 0.5619614 ## 0.5579692 0.5518650 0.5628222 0.5649971 0.5591808 0.5562027 0.5603696 0.5654805 ## 0.5573902 0.5561816 0.5579310 0.5551158 0.5524055 0.5542636 0.5482236 0.5428485 ## 0.5447559 0.5495686 0.5505104 0.5407303 0.5382094 0.5436329 0.5557471 0.5491630 ## 0.5469473 0.5415317 0.5427394 0.5486647 0.5471735 0.5435044 0.5484550 0.5515805 ## 0.5429166 0.5464184 0.5432147 0.5445609 0.5432647 0.5444191 0.5462738 0.5441565 ## 0.5402442 0.5425580 0.5475035 0.5454049 0.5468655 0.5417210 0.5510668 0.4480712 ## 0.4482484 0.4459964 0.4435336 0.4697291 0.4310182 0.4325644 0.4355506 0.4444976 ## 0.4430051 0.4480540 0.4387459 0.4354790 0.4326854 0.4378849 0.4486365 0.4287953 ## 0.4276436 0.4328285 0.4417511 0.4489659 0.4362964 0.4422617 0.4402943 0.4416799 ## 0.4182044 0.4249908 0.4261264 0.4383330 0.4381479 0.4378230 0.4406006 0.4514202

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##
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## 0.4285671 0.4425403 0.4397230 0.4515422 0.4402628 0.4529991 0.4340709 0.4413170
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## 0.4495630 0.4400173 0.4276102 0.4534550 0.4417310 0.4361071 0.4494855 0.4404064
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## 0.5037455 0.5026981 0.5085995 0.5038342 0.5093691 0.5030794 0.5042827 0.5003541
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                                                1363
## 0.5054184 0.5007126 0.5057107 0.5053082 0.5032805 0.5054930 0.5050023 0.5028788
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## 0.5039154 0.5039684 0.5006090 0.5040987 0.5031547 0.5029798 0.5018747 0.5022841
                 1382
                            1384
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                                                1387
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## 0.5020379 0.5048316 0.5012356 0.5051355 0.5015163 0.5024902 0.5046298 0.5038093
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                                      1397
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## 0.5029982 0.5042727 0.5051130 0.5037728 0.5046420 0.5030963 0.5763028 0.5905836
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## 0.5736016 0.5740311 0.5900228 0.5871261 0.5992975 0.5924027 0.5867880 0.5787261
##
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                                                                    1426
## 0.5814241 0.5783371 0.5866233 0.5728154 0.5846124 0.5843695 0.5902801 0.5751061
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       1429
## 0.5868424 0.5910233 0.5740046 0.5820994 0.5805401 0.5897680 0.5860112 0.5629936
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                                                1447
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                                                                    1450
## 0.5802180 0.5987659 0.6005250 0.5791002 0.5657081 0.5763057 0.5764411 0.5867984
##
                 1454
                           1456
                                     1457
                                                1459
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        1453
## 0.5970519 0.5828039 0.3997577 0.3859761 0.3923261 0.3845583 0.3858842 0.3883769
                  1466
                                      1469
                                                1471
        1465
                            1468
                                                          1472
                                                                    1474
## 0.3944726 0.3946570 0.3876691 0.3817313 0.3871660 0.3982043 0.3943644 0.3891366
        1477
                 1478
                            1480
                                      1481
                                                1483
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                                                                    1486
## 0.3888308 0.3887814 0.4037041 0.3947595 0.3958230 0.3951222 0.3965666 0.3982640
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                                      1493
                                                1495
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                           1492
                                                          1496
                                                                    1498
## 0.3933644 0.3807770 0.3914034 0.3906646 0.3828273 0.4015155 0.3954412
#Test model
confmatrix <- table(Actual_Value=train$label, Predicted_Value = response2 >0.5)
confmatrix
              Predicted_Value
## Actual_Value FALSE TRUE
##
                  283 229
              0
                  190 297
##
              1
#Accuracy
(confmatrix[[1,1]] + confmatrix[[2,2]])/sum(confmatrix)
```

[1] 0.5805806