101C Project

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2023-12-05

Setting up the data

6

Normal 119

220

79

```
# Reading in project data
SA.Train <- read.csv("TrainSAData2.csv")</pre>
SA.Test <- read.csv("TestSAData2NoY.csv")</pre>
# Seeing NAs
sum(is.na(SA.Train))
## [1] 130776
sum(is.na(SA.Test))
## [1] 56035
# Remove ID column
SA.Train <- SA.Train[,-1]
SA.Test <- SA.Test[,-1]
# Character to factor
SA.Train <- SA.Train %>% mutate_if(is.character, as.factor)
SA.Test <- SA.Test %>% mutate_if(is.character, as.factor)
head(SA.Train)
##
        sex age height weight waistline sight_left sight_right hear_left
## 1
       Male
             75
                    160
                            NA
                                       NA
                                                   NA
                                                               0.7
                                                                      Normal
                                     74.0
                                                               1.2
                                                                      Normal
## 2 Female
             50
                    160
                            60
                                                  1.0
                                                                      Normal
## 3
       Male
             65
                    170
                            80
                                     95.0
                                                  1.0
                                                               1.5
## 4
       <NA>
             65
                            55
                                     81.0
                    155
                                                  0.3
                                                               0.4
                                                                   Abnormal
                                     85.0
## 5
       Male
             35
                    160
                            60
                                                  1.0
                                                               1.0
                                                                      Normal
## 6 Female
             50
                    160
                            70
                                     73.2
                                                  0.3
                                                               0.4
                                                                      Normal
##
     hear_right SBP DBP BLDS tot_chole HDL_chole LDL_chole triglyceride hemoglobin
## 1
         Normal NA
                      76
                          136
                                     215
                                                 33
                                                           143
                                                                        193
                                                                                   15.0
                          125
## 2
         Normal 118
                      70
                                     207
                                                                        110
                                                                                   13.3
                                                 85
                                                           NA
## 3
         Normal 149
                      83
                          130
                                     115
                                                 48
                                                            33
                                                                         170
                                                                                   16.4
## 4
                                                 65
                                                            67
                                                                         195
       Abnormal 118
                      67
                           97
                                     171
                                                                                   13.9
## 5
         Normal 96
                           78
                                     114
                                                 42
                                                            58
                                                                         72
                                                                                   16.0
```

61

80

181

10.5

178

```
urine_protein serum_creatinine SGOT_AST SGOT_ALT gamma_GTP
## 1
                 3
                                 0.9
                                            28
                                                      23
                                                                36 23.43750
## 2
                  1
                                 0.6
                                            28
                                                      19
                                                                22 23.43750
## 3
                                 1.4
                                            41
                                                      64
                                                                53
                  1
                                                                          NA
## 4
                  1
                                 0.8
                                            26
                                                      25
                                                                NA 22.89282
## 5
                  1
                                 1.0
                                            17
                                                      24
                                                                34
                                                                          NA
## 6
                 1
                                 0.5
                                            36
                                                      NA
                                                                20 27.34375
##
     BMI.Category AGE.Category Smoking.Status Alcoholic.Status
          Healthy
## 1
                       Very Old Still Smoking
## 2
             <NA>
                       Mid-aged
                                  Never Smoked
                                                                Y
                                                                Y
## 3
       Overweight
                            Old Still Smoking
## 4
             <NA>
                                  Never Smoked
                                                                N
                            Old
                       Mid-aged Still Smoking
## 5
                                                                N
          Healthy
## 6
       Overweight
                       Mid-aged
                                  Never Smoked
                                                                N
```

head(SA.Test)

```
##
        sex age height weight waistline sight_left sight_right hear_left
## 1
       <NA>
             40
                    175
                            NA
                                       76
                                                 1.5
                                                              1.2
                                                                      Normal
## 2 Female 55
                    150
                            55
                                       81
                                                  1.0
                                                              0.9
                                                                      Normal
## 3 Female
                    155
                            50
                                       73
                                                  0.2
                                                              0.2
                                                                      Normal
                                       79
## 4 Female 60
                    155
                            50
                                                  1.0
                                                              1.0
                                                                      Normal
## 5
       Male 55
                                       84
                                                              0.9
                                                                      Normal
                    165
                            65
                                                  NA
## 6
       Male 45
                    170
                            55
                                       73
                                                  1.5
                                                              1.2
                                                                      Normal
##
     hear_right SBP DBP BLDS tot_chole HDL_chole LDL_chole triglyceride hemoglobin
## 1
         Normal 118
                           89
                                     160
                                                49
                      78
                                                           75
                                                                        181
                                     240
                                                 67
                                                                         95
                                                                                  12.6
## 2
         Normal 89
                      52
                          109
                                                          154
## 3
         Normal 102
                           86
                                     NA
                                                 48
                                                          120
                                                                         63
                                                                                  12.0
                      63
                                     222
## 4
         Normal NA
                      76
                           97
                                                 61
                                                          140
                                                                        101
                                                                                  12.9
## 5
         Normal 102
                                     198
                                                 46
                                                                        200
                                                                                  17.1
                      63
                           NA
                                                          112
## 6
         Normal 120
                      80
                           98
                                     152
                                                           55
                                                                        283
                                                                                  14.5
                                                NA
     urine_protein serum_creatinine SGOT_AST SGOT_ALT gamma_GTP
                                                                         BMI
## 1
                                 1.1
                                            18
                                                      13
                  1
                                                                15 22.85714
## 2
                  1
                                  0.7
                                            47
                                                      32
                                                                 27 24.44444
## 3
                  1
                                 0.8
                                            14
                                                      10
                                                                10 20.81165
## 4
                  1
                                  1.0
                                            33
                                                      NA
                                                                64 20.81165
## 5
                  2
                                 0.7
                                                      33
                                                                78 23.87511
                                            21
                  1
                                                      25
                                                                26
                                                                          NA
                                            17
##
     BMI.Category AGE.Category Smoking.Status
## 1
          Healthy
                       Mid-aged Still Smoking
## 2
             <NA>
                            Old
                                           <NA>
## 3
                                           <NA>
          Healthy
                       Mid-aged
## 4
          Healthy
                                  Never Smoked
                            Old
## 5
          Healthy
                            01d
                                  Never Smoked
## 6
          Healthy
                       Mid-aged Still Smoking
```

Best Models: Random Forest and GBM

Trying Random Forest, imputing NAs with randomForest package (column medians for numerical predictors and modes for categorical predictors)

```
set.seed(127)
SA.rf.impute.tr <- na.roughfix(SA.Train)</pre>
SA.rf.impute.ts <- na.roughfix(SA.Test)</pre>
SA.RF.orig <- randomForest(Alcoholic.Status~., data=SA.rf.impute.tr, importance = TRUE, ntree = 1000)
SA.RF.orig
##
## Call:
  randomForest(formula = Alcoholic.Status ~ ., data = SA.rf.impute.tr,
                                                                                importance = TRUE, ntree
##
                  Type of random forest: classification
                        Number of trees: 1000
## No. of variables tried at each split: 5
           OOB estimate of error rate: 27.4%
##
## Confusion matrix:
              Y class.error
        N
## N 24998 10115 0.2880699
## Y 9063 25824 0.2597816
OOB 27.4%
Kaggle: 72.953
predRF <- predict(SA.RF.orig, newdata = SA.rf.impute.ts, type="class")</pre>
solution <- data.frame("ID" = c(1:30000), Alcoholic.Status=predRF)</pre>
write.csv(solution, row.names = FALSE, 'RFnewsolution2.csv')
```

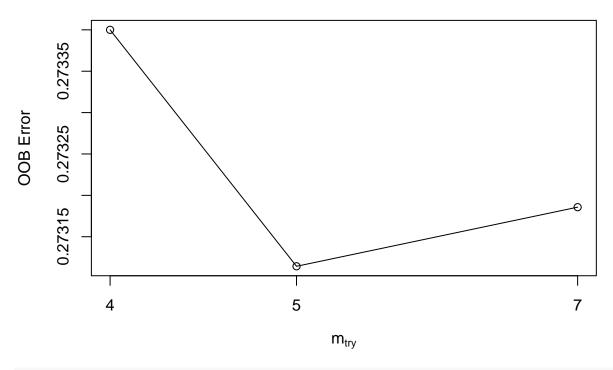
Adjusting the Random Forest

```
y <- SA.rf.impute.tr[,27]
x <- SA.rf.impute.tr[,1:26]

bestmtry <- tuneRF(x, y, ntree=1000, stepFactor = 1.5, improve = 0.01, trace=TRUE)

## mtry = 5  00B error = 27.31%
## Searching left ...
## mtry = 4  00B error = 27.34%
## -0.001046135 0.01

## Searching right ...
## mtry = 7  00B error = 27.32%
## -0.0002615336 0.01</pre>
```



bestmtry

```
mtry OOBError
          4 0.2734000
## 4.00B
## 5.00B
          5 0.2731143
## 7.00B
          7 0.2731857
SA.RF.orig2 <- randomForest(Alcoholic.Status~., data=SA.rf.impute.tr, mtry=4, ntree=2000)
SA.RF.orig2
##
## Call:
  ##
##
                Type of random forest: classification
##
                     Number of trees: 2000
## No. of variables tried at each split: 4
##
##
         OOB estimate of error rate: 27.26%
## Confusion matrix:
##
             Y class.error
        N
## N 24958 10155
                 0.2892091
## Y 8927 25960
                 0.2558833
predRF <- predict(SA.RF.orig2, newdata = SA.rf.impute.ts, type="class")</pre>
solution <- data.frame("ID" = c(1:30000), Alcoholic.Status=predRF)</pre>
write.csv(solution, row.names = FALSE, 'RFnewsolution3.csv')
```

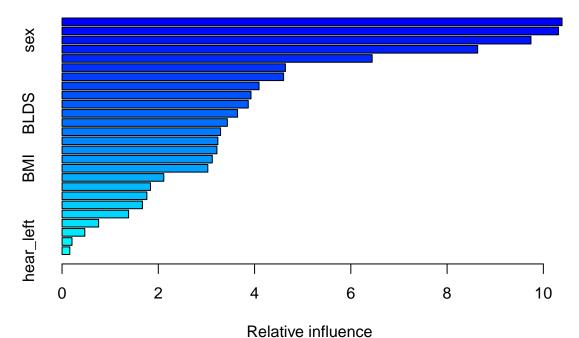
OOB 27.26% Kaggle: 72.816

Highest Accuracy comes from Random Forest model with mtry = 5, ntrees = 1000.

Trying GBM with original data (keeping NA values)

```
# New response column
SA.Train$Alcoholic.Status.Y <- ifelse(SA.Train$Alcoholic.Status == "Y", 1, 0)
set.seed(127)

SA.GBM.orig <- gbm(
    Alcoholic.Status.Y~.,
    data = SA.Train[,-27],
    distribution = "bernoulli",
    n.trees = 2500,
    interaction.depth = 6
    )
summary(SA.GBM.orig)</pre>
```



```
var
                                        rel.inf
## Smoking.Status
                      Smoking.Status 10.3882319
## age
                                 age 10.3143740
## sex
                                 sex 9.7421293
## gamma_GTP
                           gamma_GTP 8.6350295
## HDL chole
                           HDL chole 6.4431154
## SGOT_ALT
                            SGOT_ALT 4.6412304
## triglyceride
                        triglyceride 4.6029286
## hemoglobin
                          hemoglobin 4.0929161
## tot_chole
                           tot_chole 3.9253121
## LDL_chole
                           LDL_chole 3.8690525
## BLDS
                                BLDS 3.6466532
## waistline
                           waistline
                                      3.4345266
## SBP
                                 SBP
                                      3.2931240
## SGOT_AST
                            SGOT_AST 3.2375485
```

```
## height
                              height 3.2176477
## DBP
                                 DBP 3.1211379
                                 BMI 3.0286727
## BMI
                       AGE.Category 2.1142257
## AGE.Category
                          sight_left 1.8375809
## sight_left
## serum_creatinine serum_creatinine 1.7623299
## sight_right sight_right 1.6697102
                              weight 1.3824720
## weight
## BMI.Category
                      BMI.Category 0.7598201
## urine_protein
                      urine_protein 0.4729115
## hear_right
                          hear_right 0.2067034
                           hear_left 0.1606155
## hear_left
# Training data
pred.GB1 <- predict(SA.GBM.orig,data=SA.Train[,-27],n.trees = 2500, type="response")</pre>
P.bo <- ifelse(pred.GB1<0.5,0,1)
table(SA.Train$Alcoholic.Status.Y,P.bo)
##
     P.bo
##
           0
##
     0 28551 6562
##
     1 6297 28590
mean(SA.Train$Alcoholic.Status.Y!=P.bo)
## [1] 0.1837
# Testing data
pred.bo.t <- predict(SA.GBM.orig,newdata=SA.Test,n.trees = 2500, type="response")</pre>
P.bo.t <- ifelse(pred.bo.t<0.5,0,1)
P.bo.t \leftarrow ifelse(P.bo.t == 0, "N", "Y")
solution <- data.frame("ID" = c(1:30000), Alcoholic.Status=P.bo.t)</pre>
write.csv(solution, row.names = FALSE, 'newGBMsolution.csv')
```

Training data accuracy: 81.65 Kaggle test data accuracy: 72.27

Other Methods Tried

Imputing NA values using column means, Hmisc package

```
# Replace NAs with mean of each col
for (i in 1:27){
   SA.Train[,i] <- impute(SA.Train[,i], mean)
}
for(i in 1:26){</pre>
```

```
SA.Test[,i] <- impute(SA.Test[,i], mean)</pre>
}
head(SA.Train)
##
        sex age height
                         weight waistline sight_left sight_right hear_left
                                                                      Normal
## 1
                   160 63.23468 81.26761
                                            0.9807226
                                                              0.7
       Male
## 2 Female
             50
                   160 60.00000
                                  74.00000
                                            1.0000000
                                                               1.2
                                                                      Normal
## 3
       Male
             65
                   170 80.00000
                                  95.00000
                                                                      Normal
                                            1.0000000
                                                               1.5
       Male 65
                   155 55.00000
                                  81.00000
                                            0.3000000
                                                               0.4 Abnormal
## 5
       Male
             35
                   160 60.00000
                                  85.00000
                                            1.0000000
                                                               1.0
                                                                      Normal
## 6 Female 50
                   160 70.00000
                                 73.20000
                                            0.3000000
                                                               0.4
                                                                      Normal
     hear_right
                     SBP DBP BLDS tot_chole HDL_chole LDL_chole triglyceride
         Normal 122.4681
                          76
                               136
                                         215
                                                    33 143.0000
                          70
## 2
         Normal 118.0000
                               125
                                         207
                                                    85 113.2694
                                                                           110
## 3
         Normal 149.0000 83
                               130
                                         115
                                                    48
                                                         33.0000
                                                                           170
## 4
       Abnormal 118.0000 67
                                97
                                         171
                                                    65
                                                         67.0000
                                                                           195
## 5
         Normal 96.0000 62
                                78
                                         114
                                                    42
                                                         58.0000
                                                                            72
## 6
         Normal 119.0000 79
                               220
                                         178
                                                    61
                                                         80.0000
                                                                           181
##
    hemoglobin urine_protein serum_creatinine SGOT_AST SGOT_ALT gamma_GTP
## 1
           15.0
                            3
                                            0.9
                                                      28 23.00000 36.00000
## 2
           13.3
                                            0.6
                                                      28 19.00000 22.00000
                            1
## 3
           16.4
                            1
                                            1.4
                                                      41 64.00000 53.00000
## 4
           13.9
                            1
                                            0.8
                                                      26 25.00000
                                                                    36.75733
## 5
           16.0
                            1
                                            1.0
                                                      17 24.00000
                                                                    34.00000
## 6
           10.5
                            1
                                            0.5
                                                      36 25.67331 20.00000
          BMI BMI.Category AGE.Category Smoking.Status Alcoholic.Status
                                Very Old Still Smoking
## 1 23.43750
                   Healthy
                                                                        Y
                                Mid-aged
                                                                        Y
## 2 23.43750
                   Healthy
                                           Never Smoked
## 3 23.91194
                                     Old Still Smoking
                                                                        Y
                Overweight
## 4 22.89282
                   Healthy
                                     Old
                                           Never Smoked
                                                                        N
## 5 23.91194
                               Mid-aged Still Smoking
                                                                        N
                   Healthy
                Overweight
## 6 27.34375
                               Mid-aged
                                           Never Smoked
                                                                        N
##
     Alcoholic.Status.Y
## 1
## 2
                      1
## 3
                      1
## 4
                      0
## 5
                      0
## 6
                      0
```

Creating Dummy Variables

```
SA.Train$sex.Male <- ifelse(SA.Train$sex == "Male", 1, 0)
SA.Train$hear_left.Normal <- ifelse(SA.Train$hear_left == "Normal", 1, 0)
SA.Train$hear_right.Normal <- ifelse(SA.Train$hear_right == "Normal", 1, 0)
SA.Train$BMI.Healthy <- ifelse(SA.Train$BMI.Category == "Healthy", 1, 0)
SA.Train$AGE.YoungToMid <- ifelse(SA.Train$AGE.Category == "Young" | SA.Train$AGE.Category == "Mid-aged SA.Train$NeverSmoked <- ifelse(SA.Train$Smoking.Status == "Never Smoked", 1, 0)

SA.Test$sex.Male <- ifelse(SA.Test$sex == "Male", 1, 0)
```

```
SA.Test$hear_left.Normal <- ifelse(SA.Test$hear_left == "Normal", 1, 0)
SA.Test$hear_right.Normal <- ifelse(SA.Test$hear_right == "Normal", 1, 0)
SA.Test$BMI.Healthy <- ifelse(SA.Test$BMI.Category == "Healthy", 1, 0)
SA.Test$AGE.YoungToMid <- ifelse(SA.Test$AGE.Category == "Young" | SA.Test$AGE.Category == "Mid-aged",
SA.Test$NeverSmoked <- ifelse(SA.Test$Smoking.Status =="Never Smoked", 1, 0)
SA.Train \leftarrow SA.Train[,-c(1, 8, 9, 24, 25, 26, 27)]
SA.Test \leftarrow SA.Test[,-c(1, 8, 9, 24, 25, 26)]
head(SA.Train)
##
     age height
                  weight waistline sight_left sight_right
                                                                SBP DBP BLDS
## 1 75
            160 63.23468 81.26761 0.9807226
                                                      0.7 122.4681
                                                                    76
                                                                        136
## 2 50
            160 60.00000 74.00000 1.0000000
                                                      1.2 118.0000
                                                                     70
## 3
     65
            170 80.00000 95.00000 1.0000000
                                                      1.5 149.0000
                                                                     83
                                                                         130
## 4
      65
            155 55.00000 81.00000 0.3000000
                                                      0.4 118.0000
                                                                     67
                                                                          97
## 5 35
            160 60.00000 85.00000 1.0000000
                                                      1.0 96.0000
                                                                          78
            160 70.00000 73.20000 0.3000000
                                                      0.4 119.0000 79
## 6 50
                                                                         220
     tot_chole HDL_chole LDL_chole triglyceride hemoglobin urine_protein
                                            193
## 1
           215
                      33 143.0000
                                                      15.0
## 2
           207
                      85 113.2694
                                            110
                                                       13.3
                                                                        1
## 3
                      48
                          33.0000
                                            170
                                                       16.4
           115
                                                                        1
## 4
           171
                      65
                           67.0000
                                            195
                                                       13.9
                                                                        1
           114
                      42
                                             72
## 5
                           58.0000
                                                       16.0
                                                                        1
## 6
           178
                      61
                           80.0000
                                            181
                                                       10.5
##
     serum_creatinine SGOT_AST SGOT_ALT gamma_GTP
                                                       BMI Alcoholic.Status.Y
                            28 23.00000 36.00000 23.43750
## 1
                  0.9
                                                                             1
                  0.6
## 2
                            28 19.00000 22.00000 23.43750
                                                                             1
                            41 64.00000 53.00000 23.91194
## 3
                  1.4
                                                                             1
                            26 25.00000 36.75733 22.89282
                                                                             0
## 4
                  0.8
## 5
                  1.0
                            17 24.00000 34.00000 23.91194
                                                                             0
## 6
                  0.5
                            36 25.67331 20.00000 27.34375
    sex.Male hear_left.Normal hear_right.Normal BMI.Healthy AGE.YoungToMid
## 1
            1
                                                            1
## 2
            0
                             1
                                               1
                                                            1
                                                                           1
## 3
            1
                             1
                                                            0
                                                                           0
## 4
            1
                             0
                                               Ω
                                                            1
                                                                           0
## 5
            1
                             1
                                                1
## 6
                             1
                                                                           1
    NeverSmoked
## 1
               0
## 2
               1
## 3
               0
## 4
               1
## 5
               0
## 6
```

Numeric Variable Selection: PCA

```
# Principle components of the data
SA.comp <- princomp(SA.Train, scale=TRUE)</pre>
```

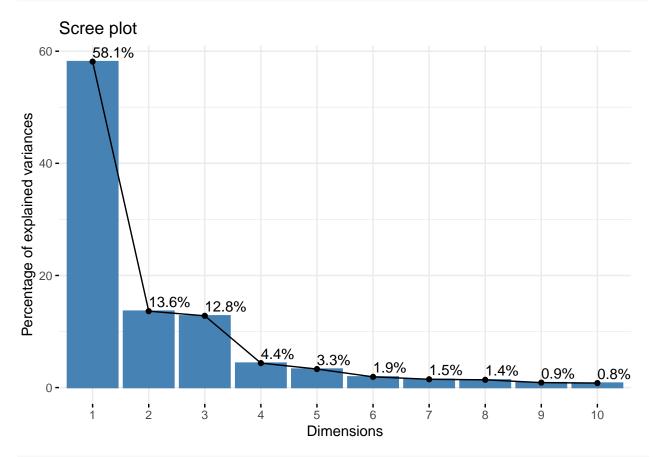
```
## Warning: In princomp.default(SA.Train, scale = TRUE) :
## extra argument 'scale' will be disregarded
summary(SA.comp)
## Importance of components:
##
                                                    Comp.3
                              Comp.1
                                         Comp.2
                                                                 Comp.4
                                                                             Comp.5
                          99.2289921 48.0553810 46.5673150 27.20216420 23.67216388
## Standard deviation
## Proportion of Variance 0.5814477
                                      0.1363696  0.1280548  0.04369587  0.03309096
## Cumulative Proportion
                           0.5814477
                                      0.7178173
                                                 0.8458721
                                                            0.88956801 0.92265897
##
                                                                    Comp.9
                              Comp.6
                                          Comp.7
                                                      Comp.8
## Standard deviation
                          18.0277314 15.84319021 15.32145787 12.257761962
## Proportion of Variance 0.0191918
                                     0.01482241
                                                 0.01386225
                                                              0.008872702
                                                              0.979408131
## Cumulative Proportion
                           0.9418508 0.95667318
                                                  0.97053543
##
                               Comp. 10
                                          Comp.11
                                                      Comp.12
                                                                   Comp.13
## Standard deviation
                          11.670589661 8.65594226 7.941536642 5.994596454
## Proportion of Variance 0.008043019 0.00442448 0.003724282 0.002122039
## Cumulative Proportion
                           0.987451151 0.99187563 0.995599913 0.997721952
##
                              Comp.14
                                          Comp.15
                                                       Comp.16
                                                                     Comp.17
## Standard deviation
                          5.741967161 1.450101980 1.260183e+00 6.368807e-01
## Proportion of Variance 0.001946951 0.000124174 9.377791e-05 2.395244e-05
## Cumulative Proportion 0.999668903 0.999793077 9.998869e-01 9.999108e-01
##
                               Comp.18
                                            Comp.19
                                                         Comp.20
## Standard deviation
                          5.344055e-01 4.972797e-01 4.796607e-01 4.157800e-01
## Proportion of Variance 1.686457e-05 1.460276e-05 1.358632e-05 1.020847e-05
## Cumulative Proportion 9.999277e-01 9.999423e-01 9.999559e-01 9.999661e-01
##
                               Comp.22
                                            Comp.23
                                                          Comp.24
## Standard deviation
                          3.985526e-01 3.851105e-01 3.597775e-01 2.885831e-01
## Proportion of Variance 9.380040e-06 8.757987e-06 7.643664e-06 4.917850e-06
## Cumulative Proportion 9.999754e-01 9.999842e-01 9.999919e-01 9.999968e-01
##
                               Comp.26
                                            Comp.27
## Standard deviation
                          2.015620e-01 1.187037e-01
## Proportion of Variance 2.399113e-06 8.320736e-07
## Cumulative Proportion 9.999992e-01 1.000000e+00
SA.comp$loadings[,1:4]
```

```
##
                             Comp.1
                                          Comp.2
                                                        Comp.3
                                                                      Comp.4
                      6.158182e-03
## age
                                    2.266958e-03
                                                  3.002744e-03
                                                                7.087705e-03
## height
                       1.288611e-02 -1.135391e-02 2.293877e-02
                                                                1.970203e-02
## weight
                       3.524750e-02 -1.024007e-03 4.103603e-02
                                                                7.313678e-02
## waistline
                       2.914734e-02 5.744847e-05
                                                  3.212815e-02
                                                                5.867858e-02
## sight_left
                       8.851378e-05
                                    5.603371e-05
                                                  7.855691e-05
                                                                1.070611e-04
                       4.383762e-05
                                    2.546500e-05
                                                  1.053732e-04
                                                                1.371807e-04
## sight_right
## SBP
                       2.699084e-02
                                    2.244556e-03
                                                  3.626238e-02
                                                                3.759024e-02
## DBP
                       1.929676e-02
                                    8.980266e-03
                                                  2.612180e-02
                                                                2.245965e-02
## BLDS
                      5.246649e-02 -3.509433e-02 5.833909e-02 4.857229e-02
## tot chole
                      1.079953e-01
                                    7.188102e-01
                                                  9.034542e-02 -4.385704e-02
## HDL_chole
                      -4.843089e-02 3.929699e-02
                                                  2.140790e-02 -7.157037e-02
## LDL_chole
                      1.661021e-02 6.765324e-01
                                                  8.074964e-02
                                                                2.605012e-02
## triglyceride
                      9.731269e-01 -6.282319e-02 -1.968142e-01 -1.134529e-02
## hemoglobin
                      3.789699e-03 1.379209e-03 5.449412e-03 5.364971e-03
## urine protein
                      1.766008e-04 -1.448129e-04 3.384119e-04 2.619710e-04
```

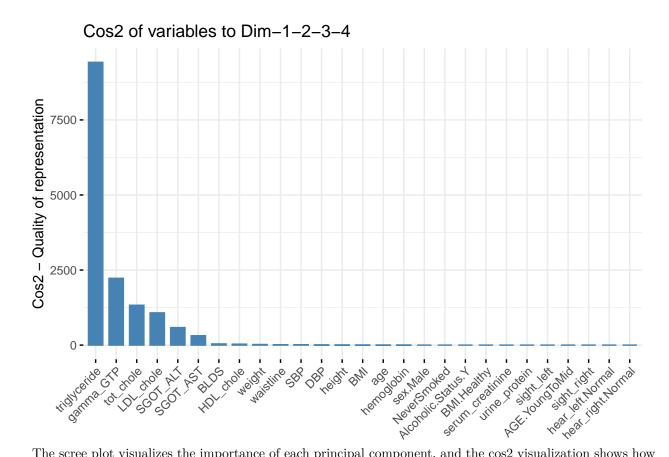
```
## serum_creatinine
                       2.791863e-04 -2.172934e-04 4.790365e-04 4.360275e-04
## SGOT_AST
                      3.006845e-02 -2.786679e-02 1.956375e-01
                                                                5.426932e-01
## SGOT ALT
                       5.496297e-02 -1.385976e-02 2.409396e-01
                                                                7.600797e-01
## gamma_GTP
                       1.690093e-01 -1.330164e-01 9.170791e-01 -3.254853e-01
## BMI
                      9.119033e-03
                                    2.661211e-03
                                                  8.412317e-03
                                                                2.066638e-02
## Alcoholic.Status.Y
                      5.879820e-04 -5.253028e-04 1.734070e-03 -9.271271e-04
                      1.093227e-03 -7.868124e-04
## sex.Male
                                                  1.930052e-03
                                                                1.324263e-03
## hear_left.Normal
                      4.902147e-06
                                    1.105544e-04
                                                  2.430522e-07
                                                                3.493657e-06
## hear_right.Normal
                     -3.590701e-06
                                    8.398128e-05 -2.636062e-05 -3.588350e-05
## BMI.Healthy
                                    1.235014e-04 -8.673623e-04 -1.731089e-03
                      -8.469240e-04
## AGE.YoungToMid
                      -5.610091e-05
                                    5.660319e-05 -4.482975e-05 -2.424116e-04
## NeverSmoked
                                    6.476944e-04 -1.605028e-03 -2.135743e-04
                      -9.854110e-04
```

After computing the PCA for the training data, the results show that that first 4 principal components are the most significant since they explain almost 90% of the total variance.

```
# Scree plot
fviz_eig(SA.comp, addlabels = TRUE)
```



Viz to see how much each variable contributes to the 4 components
fviz_cos2(SA.comp, choice="var", axes=1:4)



The scree plot visualizes the importance of each principal component, and the cos2 visualization shows how much each variable contributes to the 4 most significant principal components.

From this visualization, triglyceride, gamma_GTP, tot_chole, LDL_chole, SGOT_ALT, and SGOT_AST appear to be the most significant predictors in the data set.

New Data Frame with Selected Predictors

```
# New SA. Train
SA.Train.sel <- data.frame(</pre>
  # Selected numeric predictors
  Triglyceride = SA.Train$triglyceride,
  Gamma.GTP = SA.Train$gamma_GTP,
  Tot.Chole = SA.Train$tot_chole,
  LDL.Chole = SA.Train$LDL_chole,
  SGOT.ALT = SA.Train$SGOT_ALT,
  SGOT.AST = SA.Train$SGOT_AST,
  Alcoholic.Status.Y= SA.Train$Alcoholic.Status.Y,
  # All categorical predictors
  sex.Male = SA.Train$sex.Male,
  hear_left.Normal =SA.Train$hear_left.Normal,
  hear_right.Normal =SA.Train$hear_right.Normal,
  BMI.Healthy = SA.Train$BMI.Healthy,
  AGE. YoungToMid = SA. Train$AGE. YoungToMid,
  NeverSmoked = SA.Train$NeverSmoked
)
```

```
# New SA.Test
SA.Test.sel <- data.frame(</pre>
  # Selected numeric predictors
 Triglyceride = SA.Test$triglyceride,
 Gamma.GTP = SA.Test$gamma_GTP,
  Tot.Chole = SA.Test$tot_chole,
  LDL.Chole = SA.Test$LDL_chole,
  SGOT.ALT = SA.Test$SGOT ALT,
  SGOT.AST = SA.Test$SGOT_AST,
  # All categorical predictors
  sex.Male = SA.Test$sex.Male,
  hear_left.Normal =SA.Test$hear_left.Normal,
  hear_right.Normal =SA.Test$hear_right.Normal,
  BMI.Healthy = SA.Test$BMI.Healthy,
  AGE.YoungToMid = SA.Test$AGE.YoungToMid,
  NeverSmoked = SA.Test$NeverSmoked
```

Categorical Variable Selection: Random Forest

SGOT.ALT

SGOT.AST

sex.Male

```
SA.Train.sel$Alcoholic.Status.Y <- as.factor(SA.Train.sel$Alcoholic.Status.Y)
set.seed(124)
SA.RF.VS <- randomForest(Alcoholic.Status.Y~., data = SA.Train.sel, mtry=3, importance = TRUE, ntree = 1
SA.RF.VS
##
## Call:
## randomForest(formula = Alcoholic.Status.Y ~ ., data = SA.Train.sel, mtry = 3, importance = TRU
##
                 Type of random forest: classification
                       Number of trees: 500
##
## No. of variables tried at each split: 3
          OOB estimate of error rate: 29.74%
##
## Confusion matrix:
        0
             1 class.error
## 0 24920 10193 0.2902913
## 1 10625 24262
                 0.3045547
importance(SA.RF.VS)
                                       1 MeanDecreaseAccuracy MeanDecreaseGini
## Triglyceride
                    -25.647831 44.580824
                                                   18.834958
                                                                     3661.6032
## Gamma.GTP
                    42.465780 105.174623
                                                  138.065662
                                                                     4095.7381
## Tot.Chole
                    41.256462 19.146261
                                                                     3507.9083
                                                   64.741118
## LDL.Chole
                    35.462686 30.464741
                                                   66.489999
                                                                     3462.8814
```

53.015872

50.760788

124.057294

2901.8425

2688.6919

2549.8530

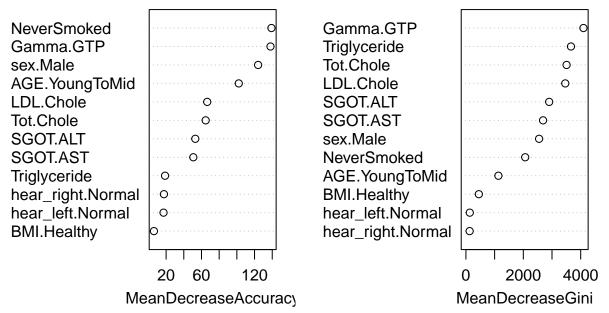
18.816186 26.074867

63.661608 51.545494

8.589031 39.057027

```
## hear_left.Normal
                       -7.287819
                                  27.919754
                                                        17.093439
                                                                           134.3764
## hear_right.Normal
                      -1.070163
                                  23.311091
                                                        17.545909
                                                                           129.2939
                                                                           450.7875
## BMI.Healthy
                       -1.360733
                                   9.304299
                                                         6.209884
## AGE.YoungToMid
                       41.270135 105.944464
                                                       102.175516
                                                                          1131.9180
## NeverSmoked
                      111.084265
                                  23.251231
                                                       139.107332
                                                                          2065.4335
varImpPlot(SA.RF.VS)
```

SA.RF.VS



Based on the variable importance plot from the Random Forest fit to the training data, the most significant categorical variables are NeverSmoked, sex.Male, and AGE.YoungToMid.

Updated Data Frame with Selected Predictors

```
SA.Train.sel \leftarrow SA.Train.sel[,-c(9,10,11)]
SA.Test.sel \leftarrow SA.Test.sel[,-c(8,9,10)]
head(SA.Train.sel)
##
     Triglyceride Gamma.GTP Tot.Chole LDL.Chole SGOT.ALT SGOT.AST
## 1
               193
                    36.00000
                                    215
                                          143.0000 23.00000
                                                                    28
## 2
               110
                    22.00000
                                    207
                                          113.2694 19.00000
                                                                    28
## 3
               170
                    53.00000
                                    115
                                           33.0000 64.00000
                                                                    41
                                                                    26
## 4
               195
                    36.75733
                                    171
                                           67.0000 25.00000
## 5
                72
                    34.00000
                                    114
                                           58.0000 24.00000
                                                                    17
                    20.00000
                                           80.0000 25.67331
## 6
               181
                                    178
                                                                    36
     Alcoholic.Status.Y sex.Male AGE.YoungToMid NeverSmoked
```

```
## 1
                                             0
## 2
                     1
                              0
                                             1
                                                         1
## 3
                                             0
                     1
## 4
                     0
                              1
                                             0
                                                         1
## 5
                     0
                                                         0
## 6
                                                         1
head(SA.Test.sel)
    Triglyceride Gamma.GTP Tot.Chole LDL.Chole SGOT.ALT SGOT.AST sex.Male
##
## 1
             181
                        15 160.0000
                                           75 13.00000
## 2
                        27
                                                              47
                                                                        0
              95
                            240.0000
                                          154 32.00000
                        10 195.5427
## 3
                                         120 10.00000
                                                              14
                                                                        0
              63
## 4
             101
                        64 222.0000
                                                              33
                                                                        0
                                          140 25.72149
             200
                        78 198.0000
                                                              21
## 5
                                          112 33.00000
                                                                        1
             283
                        26 152.0000
                                           55 25.00000
                                                              17
                                                                        1
## 6
##
   AGE.YoungToMid NeverSmoked
## 1
                 1
## 2
                 0
                             1
## 3
                 1
                             1
## 4
                 0
                             1
                 0
## 5
## 6
                             0
```

Building Models using Selected Predictors

Logstic Regression

Kaggle score: 0.69413

```
SA.LR <- glm(Alcoholic.Status.Y~., data = SA.Train.sel, family="binomial")

# Training data
pred.LR <- predict(SA.LR,data=SA.Train.sel, type="response")
P.bo <- ifelse(pred.LR<0.5,0,1)

# Training Confusion Matrix
table(SA.Train.sel$Alcoholic.Status.Y,P.bo)

## P.bo
## 0 1
## 0 24513 10600
## 1 10693 24194

# Training Error Rate
mean(SA.Train.sel$Alcoholic.Status.Y!=P.bo)

## [1] 0.3041857
```

Random Forest

```
SA.RF.sel <- randomForest(</pre>
 x = SA.Train.sel[,c("Triglyceride", "Gamma.GTP", "Tot.Chole", "LDL.Chole", "SGOT.ALT", "SGOT.AST", "s
 y = SA.Train.sel$Alcoholic.Status.Y,
 mtry = 2,
 ntree=500,
 stepFactor=1.5,
 improve=0.01,
SA.RF.sel
##
## randomForest(x = SA.Train.sel[, c("Triglyceride", "Gamma.GTP", "Tot.Chole", "LDL.Chole", "SGOT
                 Type of random forest: classification
                        Number of trees: 500
## No. of variables tried at each split: 2
##
           OOB estimate of error rate: 29.74%
##
## Confusion matrix:
       0 1 class.error
## 0 24847 10266  0.2923703
## 1 10550 24337 0.3024049
```

Neural Net

```
SA.NN <- neuralnet(
  Alcoholic.Status.Y ~ .,
  data = SA.Train.sel,
  hidden = 5,
  linear.output=FALSE,
  lifesign = "full",
  rep = 2,
  algorithm = "rprop+",
  stepmax = 100000
)</pre>
```