FIT5197_ass3_wk11

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First load tree package:

```
library(tree)
```

```
## Warning: package 'tree' was built under R version 3.4.4
```

Then, we load the fire and preprocess for tree:

```
train <- read.csv('./diabetes_train.csv')
test <- read.csv('./diabetes_test.csv')
train$Y <- as.factor(train$Y > 200)
test$Y <- as.factor(test$Y > 200)
tree_diabetes <- tree(Y~., train)
summary(tree_diabetes)</pre>
```

```
##
## Classification tree:
## tree(formula = Y ~ ., data = train)
## Variables actually used in tree construction:
## [1] "S5" "BP" "BMI" "S1" "S6"
## Number of terminal nodes: 22
## Residual mean deviance: 0.4364 = 144.9 / 332
## Misclassification error rate: 0.0904 = 32 / 354
```

Take a peek at the tree:

```
tree_diabetes
```

```
## node), split, n, deviance, yval, (yprob)
##
         * denotes terminal node
##
##
     1) root 354 405.600 FALSE ( 0.74011 0.25989 )
##
      2) S5 < 4.88275 241 173.200 FALSE ( 0.88382 0.11618 )
##
         4) BP < 102.5 199 85.080 FALSE ( 0.94472 0.05528 )
           8) BMI < 25.75 144 29.160 FALSE ( 0.97917 0.02083 )
##
##
           16) S1 < 184.5 91 0.000 FALSE ( 1.00000 0.00000 ) *
            17) S1 > 184.5 53 23.060 FALSE ( 0.94340 0.05660 )
##
##
              ##
              35) S5 > 4.3882 26 18.600 FALSE ( 0.88462 0.11538 )
##
                70) S6 < 88.5 11 12.890 FALSE ( 0.72727 0.27273 ) *
##
                71) S6 > 88.5 15  0.000 FALSE ( 1.00000 0.00000 ) *
##
           9) BMI > 25.75 55 45.620 FALSE ( 0.85455 0.14545 )
##
            18) BMI < 29.1 30 32.600 FALSE ( 0.76667 0.23333 ) *
##
            19) BMI > 29.1 25
                               8.397 FALSE ( 0.96000 0.04000 ) *
##
         5) BP > 102.5 42 56.690 FALSE ( 0.59524 0.40476 )
##
          10) BMI < 26.9 25 21.980 FALSE ( 0.84000 0.16000 ) *
          11) BMI > 26.9 17 18.550 TRUE ( 0.23529 0.76471 )
##
            22) S5 < 4.42395 8 11.090 FALSE ( 0.50000 0.50000 ) *
##
##
                                0.000 TRUE ( 0.00000 1.00000 ) *
            23) S5 > 4.42395 9
##
      3) S5 > 4.88275 113 154.700 TRUE ( 0.43363 0.56637 )
##
         6) BMI < 31.55 78 106.800 FALSE ( 0.56410 0.43590 )
##
         12) BMI < 24.25 13 7.051 FALSE ( 0.92308 0.07692 ) *
##
         13) BMI > 24.25 65 90.090 TRUE ( 0.49231 0.50769 )
##
            26) S5 < 5.3822 54 73.670 FALSE ( 0.57407 0.42593 )
##
              52) S6 < 99.5 43 55.620 FALSE ( 0.65116 0.34884 )
              104) BMI < 29.45 35 47.800 FALSE ( 0.57143 0.42857 )
##
                 208) S6 < 86.5 7 5.742 TRUE ( 0.14286 0.85714 ) * 209) S6 > 86.5 28 35.160 FALSE ( 0.67857 0.32143 )
##
##
##
                   418) BMI < 28.35 23 24.080 FALSE ( 0.78261 0.21739 )
##
                     836) S5 < 5.0138 12 16.300 FALSE ( 0.58333 0.41667 ) *
##
                     837) S5 > 5.0138 11
                                          0.000 FALSE ( 1.00000 0.00000 ) *
                   419) BMI > 28.35 5 5.004 TRUE ( 0.20000 0.80000 ) *
##
##
              105) BMI > 29.45 8  0.000 FALSE ( 1.00000 0.00000 ) *
##
              53) S6 > 99.5 11 12.890 TRUE ( 0.27273 0.72727 )
##
               106) S5 < 5.0464 5 6.730 FALSE ( 0.60000 0.40000 ) *
##
              107) S5 > 5.0464 6  0.000 TRUE ( 0.00000 1.00000 ) *
##
            27) S5 > 5.3822 11 6.702 TRUE ( 0.09091 0.90909 ) *
##
         7) BMI > 31.55 35 28.710 TRUE ( 0.14286 0.85714 )
##
         14) BP < 109.5 17 20.600 TRUE ( 0.29412 0.70588 )
##
            28) S6 < 103.5 11 15.160 TRUE ( 0.45455 0.54545 )
##
              56) S1 < 195 6
                              5.407 TRUE ( 0.16667 0.83333 ) *
##
              57) S1 > 195 5
                               5.004 FALSE ( 0.80000 0.20000 ) *
##
            29) S6 > 103.5 6
                              0.000 TRUE ( 0.00000 1.00000 ) *
##
          15) BP > 109.5 18  0.000 TRUE ( 0.00000 1.00000 ) *
train$S5_cnt = as.factor(train$S5<4.88275)</pre>
train$BP_cnt = as.factor(train$BP<102.5)</pre>
train$BMI_cnt = as.factor(train$BMI<31.55)</pre>
attach(train)
table(S5_cnt, Y)
## S5 cnt FALSE TRUE
##
    FALSE
             49
                   64
##
    TRUE
             213
                   28
table(BP cnt, Y)
##
         Y
## BP cnt FALSE TRUE
##
    FALSE
             45
                  53
    TRUE
             217
table(BMI_cnt, Y)
```

```
## Y
## BMI_cnt FALSE TRUE
## FALSE 15 37
## TRUE 247 55
```

From above, we can compute their entropy:

$$\begin{split} H(Y|S5>4.88275) &= -\frac{49}{113}\log_2(\frac{49}{113}) - \frac{64}{113}\log_2(\frac{64}{113}) = 0.6899765\\ H(Y|S5<4.88275) &= -\frac{213}{241}\log_2(\frac{213}{241}) - \frac{28}{241}\log_2(\frac{64}{113}) = 0.5182873\\ p(S5>4.88275) &= \frac{113}{354} = 0.319209\\ p(S5<4.88275) &= \frac{241}{354} = 0.680791 \end{split}$$

 $H(S5) = p(S5 > 4.88275) \cdot H(Y|S5 > 4.88275) + p(S5 < 4.88275) \cdot H(Y|S5 < 4.88275) = 0.667985$

$$H(Y|BP>102.5) = -\frac{45}{98} \log_2(\frac{45}{98}) - \frac{53}{98} \log_2(\frac{53}{98}) = 0.9951877$$

$$H(Y|BP<102.5) = -\frac{217}{256} \log_2(\frac{217}{256}) - \frac{39}{256} \log_2(\frac{39}{256}) = 0.6156746$$

$$p(BP>102.5) = \frac{98}{354} = 0.2768362$$

$$p(BP<102.5) = \frac{256}{354} = 0.7231638$$

 $H(BP) = p(BP > 102.55) \cdot H(Y|BP > 102.5) + p(BP < 102.5) \cdot H(Y|BP < 102.5) = 0.7207375$

$$H(Y|BMI>31.55) = -\frac{15}{52}log_{2}(\frac{15}{52}) - \frac{37}{52}log_{2}(\frac{37}{52}) = 0.8667256$$

$$H(Y|BMI<31.55) = -\frac{247}{302}log_{2}(\frac{247}{302}) - \frac{55}{302}log_{2}(\frac{55}{302}) = 0.6846912$$

$$p(BMI>31.55) = \frac{52}{354} = 0.1468927$$

$$p(BMI<31.55) = \frac{302}{354} = 0.8531073$$

 $H(BP) = p(BMI > 31.55) \cdot H(Y|BMI > 31.55) + p(BMI < 31.55) \cdot H(Y|BMI < 31.55) = 0.7114307$

Hence, the best test to use at the root of the tree is S5.