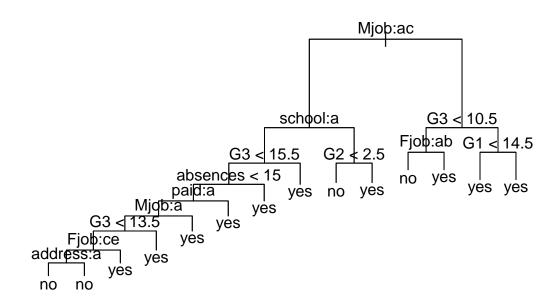
ML-2017-FALL-NOUL-PROJECT-RF

$Noul\ Singla$

November 14, 2017

```
#implementation of a TREE

internet.tree1 <- tree(internet~.,Train.Student.Data)
plot(internet.tree1)
text(internet.tree1)</pre>
```



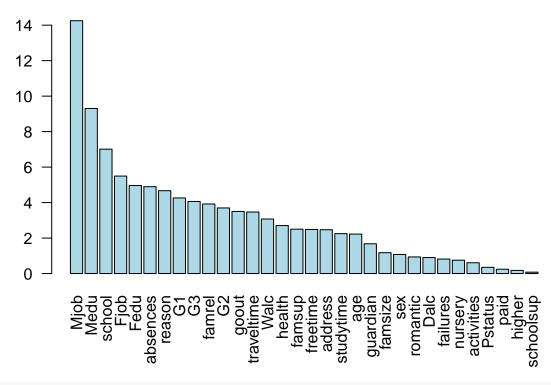
```
prd1 <- predict(internet.tree1,newdata = Train.Student.Data,type="class")
table(prd1,Train.Student.Data$internet)

##
## prd1 no yes
## no 25 10
## yes 94 390

#implementation of a Bagging

#internet.bagging1 <- bagging(internet~.,data=Train.Student.Data,mfinal=50)
predict.train.bagging1 <- predict(internet.bagging1,newdata=Train.Student.Data)
importanceplot(internet.bagging1,las=2)</pre>
```

Variables relative importance



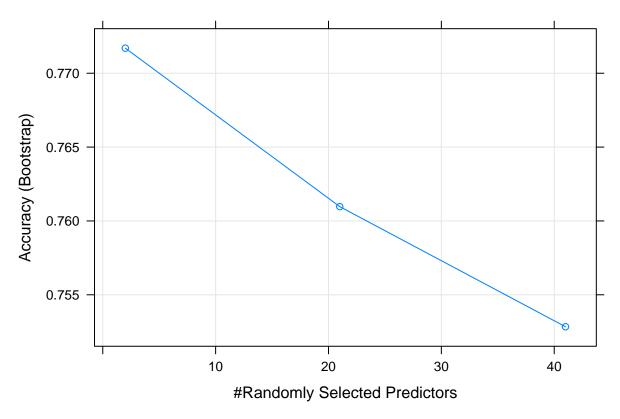
predict.train.bagging1\$confusion

```
## Observed Class
## Predicted Class no yes
## no 61 1
## yes 58 399

#implementation of a Random Forest

#internet.rf <- train(internet~., data=Train.Student.Data,type="rf")

plot(internet.rf)</pre>
```



```
# str(internet.rf)
#prd <- predict(internet.rf,newdata=Train.Student.Data)

tcontrol = trainControl(method="repeatedcv",number=5,repeats=5)
#internet.rf1 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=10, trCont

tcontrol = trainControl(method="repeatedcv",number=5,repeats=5,search="random")
#internet.rf2 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=10, trCont

tcontrol = trainControl(method="repeatedcv",number=5,repeats=5,search="grid")
#internet.rf3 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=10, trCont

tcontrol = trainControl(method="repeatedcv",number=10,repeats=4)
#internet.rf11 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=20, trCon

tcontrol = trainControl(method="repeatedcv",number=20,repeats=10,search="random")
#internet.rf22 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=20, trCon

tcontrol = trainControl(method="repeatedcv",number=20,repeats=10,search="random")
#internet.rf22 <- train(internet-., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=20, trCon

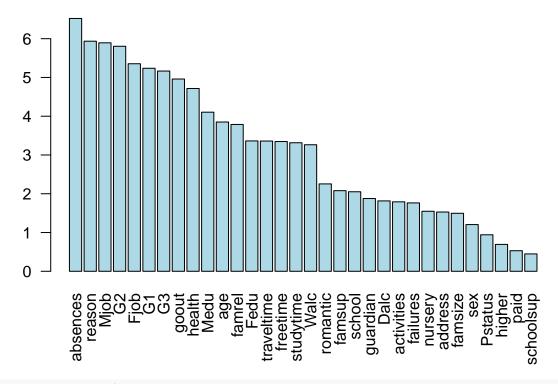
tcontrol = trainControl(method="repeatedcv",number=20,repeats=10,search="grid")</pre>
```

```
\#internet.rf33 \leftarrow train(internet~., data=Train.Student.Data,metric="Accuracy",type="rf",ntree=20, trConditions for the state of the st
prd.trn <- predict(internet.rf,Train.Student.Data)</pre>
rf.table <- table(prd.trn,Train.Student.Data$internet)</pre>
rf.table
##
## prd.trn no yes
                 no 105
                  yes 14 400
##
prd.trn1 <- predict(internet.rf1,Train.Student.Data)</pre>
rf1.table <- table(prd.trn1,Train.Student.Data$internet)</pre>
rf1.table
##
## prd.trn1 no yes
                     no 71
                     yes 48 400
prd.trn2 <- predict(internet.rf2,Train.Student.Data)</pre>
rf2.table <- table(prd.trn2,Train.Student.Data$internet)</pre>
rf2.table
##
## prd.trn2 no yes
                     no 106
                     yes 13 400
prd.trn3 <- predict(internet.rf3,Train.Student.Data)</pre>
rf3.table <- table(prd.trn3,Train.Student.Data$internet)</pre>
rf3.table
##
## prd.trn3 no yes
                  no 75
##
                     yes 44 400
prd.trn11 <- predict(internet.rf11,Train.Student.Data)</pre>
rf11.table <- table(prd.trn11, Train.Student.Data$internet)
rf11.table
##
## prd.trn11 no yes
##
                       no 91 0
                       yes 28 400
prd.trn22 <- predict(internet.rf22,Train.Student.Data)</pre>
rf22.table <- table(prd.trn22,Train.Student.Data$internet)</pre>
rf22.table
##
## prd.trn22 no yes
##
                       no 119
##
                       yes 0 400
prd.trn33 <- predict(internet.rf33,Train.Student.Data)</pre>
rf33.table <- table(prd.trn33,Train.Student.Data$internet)
```

```
##
## prd.trn33 no yes
## no 79 0
## yes 40 400
#implementation of a Adaboost

#internet.boost1 <- boosting(internet~.,data=Train.Student.Data,boos=TRUE,mfinal=100)
predict.train.boost1 <-predict(internet.boost1,newdata=Train.Student.Data)
importanceplot(internet.boost1,las=2)</pre>
```

Variables relative importance

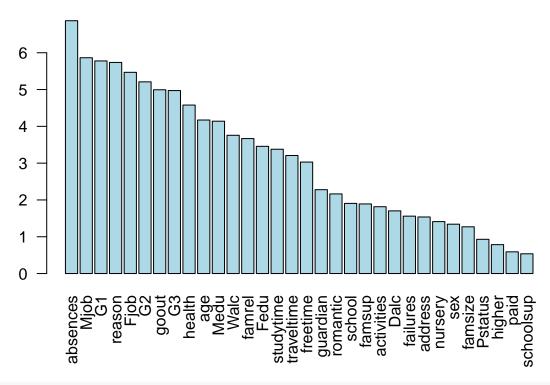


predict.train.boost1\$confusion

```
## Observed Class
## Predicted Class no yes
## no 119 0
## yes 0 400

#internet.boost2 <- boosting(internet~.,data=Train.Student.Data,boos=TRUE,mfinal=500)
predict.train.boost2 <- predict(internet.boost2,newdata=Train.Student.Data)
importanceplot(internet.boost2,las=2)</pre>
```

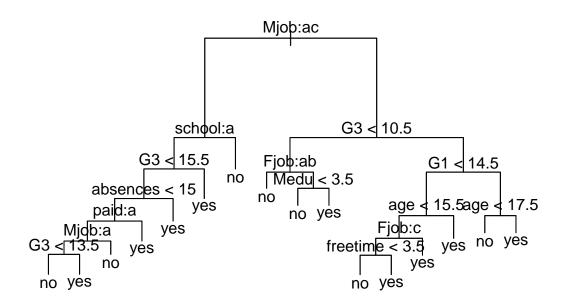
Variables relative importance



predict.train.boost2\$confusion

```
## Predicted Class no yes
## no 119 0
## yes 0 400

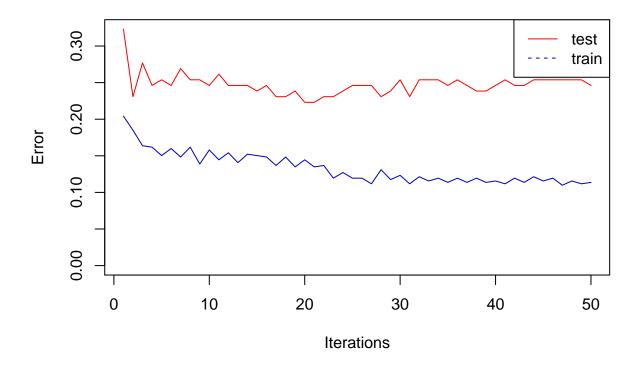
# TREE by training on increased dat for favourable set
train_data_no <- Train.Student.Data[Train.Student.Data$internet=="no",]
Train.Student.Data.biased <- rbind(Train.Student.Data,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,train_data_no,tr
```



```
prd1 <- predict(internet.tree2,newdata = Train.Student.Data.biased,type="class")</pre>
table(prd1,Train.Student.Data.biased$internet)
##
## prd1
          no yes
         595 212
##
     no
           0 188
     yes
#varying threshold
#threshold1 <- 0.4
#var.prd1.tree1 <- predict(internet.tree1, newdata = Train.Student.Data)</pre>
#table(ifelse(var.prd1.tree1[,1]>threshold1, "no", "yes"), Train.Student.Data$internet)
\#var.prd1.tree2 \leftarrow predict(internet.tree2, newdata = Train.Student.Data)
\#table(ifelse(var.prd1.tree2[,1]>threshold1,"no","yes"),Train.Student.Data\$internet)
#TEST DATA PREDICTIONS And ERROR CHECK
#TREE
prd.tst1 <- predict(internet.tree1,Test.Student.Data,type="class")</pre>
table(prd.tst1,Test.Student.Data$internet)
##
## prd.tst1 no yes
##
            2
        no
```

```
yes 30 92
##
#Baggin Best
predict.test.bagging1 <- predict(internet.bagging1,newdata=Test.Student.Data)</pre>
predict.test.bagging1$confusion
                   Observed Class
##
## Predicted Class no yes
                     3
##
               no
##
               yes 29 95
error1 <- errorevol(internet.bagging1,newdata=Train.Student.Data)</pre>
error2 <- errorevol(internet.bagging1,newdata=Test.Student.Data)</pre>
plot.errorevol(error2,error1)
```

Ensemble error vs number of trees



```
#Random Forest Best

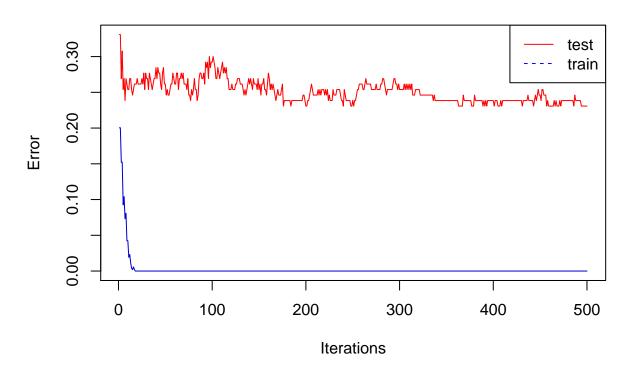
prd.tst22 <- predict(internet.rf22,Test.Student.Data)
rf22.test.table <- table(prd.tst22,Test.Student.Data$internet)
rf22.test.table

##
## prd.tst22 no yes
## no 5 7
## yes 27 91

# Boosting Best

predict.test.boost2 <- predict(internet.boost2,newdata=Test.Student.Data)</pre>
```

Ensemble error vs number of trees



```
#Biased tree
prd.tree2 <- predict(internet.tree2,Test.Student.Data,type="class")
table(prd.tree2,Test.Student.Data$internet)

##
## prd.tree2 no yes
## no 24 65
## yes 8 33

#Varying threshold for cutoff

#TREE
#threshold1 <- 0.4
#var.prd1.tree1 <- predict(internet.tree1,newdata = Train.Student.Data)
#table(ifelse(var.prd1.tree1[,1]>threshold1,"no","yes"),Train.Student.Data$internet)
```