Alternative Turnout Models - Fit to Monroe County

```
library(randomForest)
## randomForest 4.6-12
## Type rfNews() to see new features/changes/bug fixes.
library(ROCR)
## Warning: package 'ROCR' was built under R version 3.3.3
## Loading required package: gplots
##
## Attaching package: 'gplots'
## The following object is masked from 'package:stats':
##
##
       lowess
library(ggplot2)
## Attaching package: 'ggplot2'
## The following object is masked from 'package:randomForest':
##
##
       margin
monroe_data <- as.data.frame(read.csv("c:/Dropbox (UFL)//incubator/monroe_data.csv"))</pre>
\#monroe\_data \leftarrow as.data.frame(read.csv("/Users/isaac/Dropbox (UFL)//incubator/monroe\_data.csv"))
test_election = monroe_data['X2014.11']
train_election = monroe_data['X2010.11']
red_train_data <- as.data.frame(read.csv("c:/Dropbox (UFL)//incubator/monroe_red_train_dat.csv"))[,-1]</pre>
#red_train_data <- as.data.frame(read.csv("/Users/isaac/Dropbox (UFL)//incubator/monroe_red_train_dat.c</pre>
head(red_train_data)
     X2006.01 X2006.03 X2006.04 X2006.09 X2006.11 X2007.03 X2007.04 X2007.05
##
## 1
                      0
## 2
            0
                      0
                                0
                                         0
                                                             0
                                                                       0
                                                                                0
                                                   1
## 3
            0
                      0
                                         0
                                                   0
                                                             0
                                                                                0
                                         0
                                                             0
                                                                                0
## 4
            0
                      0
                                0
                                                   1
                                                                       0
## 5
            0
                      0
                                         0
                                                   0
                                                             0
## 6
            0
                      0
                                0
                                         0
                                                   0
                                                             0
     X2007.10 X2007.11 X2008.01 X2008.03 X2008.04 X2008.08 X2008.11 X2009.03
## 1
                      0
                                0
                                         0
                                                   0
                                                                       0
                                                                                0
            0
                                                             0
## 2
            0
                      0
                                0
                                         0
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## 3
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## 4
            0
                      0
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## 5
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            0
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     X2009.07 X2009.10 X2009.11 X2010.03 X2010.08 X2011.10 X2011.11 X2012.01
                                0
                                         0
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                                                                                0
## 1
            0
                      0
                                                             0
## 2
                      0
                                0
                                         0
                                                   0
                                                             0
                                                                       0
                                                                                0
## 3
                      0
                                0
                                         0
                                                   1
                                                             0
                                                                       1
```

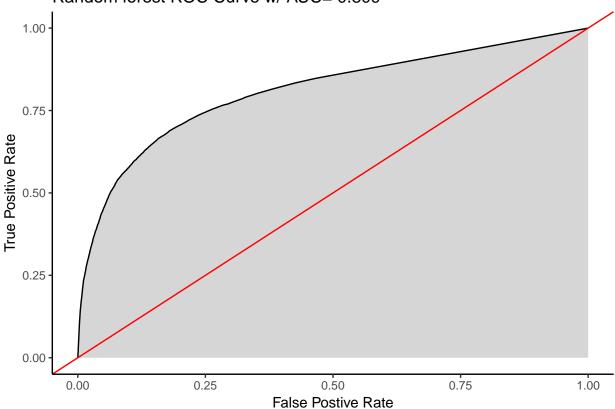
```
## 4
             0
                       0
                                 0
                                           0
                                                     0
                                                                0
                                                                          0
## 5
             0
                       0
                                 0
                                           0
                                                     0
                                                                0
                                                                          0
                                                                                    0
## 6
             0
                       0
                                 0
                                           0
                                                      0
                                                                0
                                                                                    0
     X2012.08 X2012.11 X2013.03 X2013.10 X2013.11 X2014.03 X2014.08
##
## 1
             0
                       1
                                 0
                                           0
                                                     0
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                                                                          0
## 2
             0
                                 0
                                           0
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                                                                          0
                       1
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## 5
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## 6
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                       0
                                 0
                                           0
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                                                                          Λ
     ResidenceZipcode Gender Race PartyAffiliation Precinct VoterStatus
                                                                              0
## 1
                      0
                              0
                                                       0
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                                   0
## 2
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                      1
                              1
                                   0
                                                       1
                                                                 1
                      2
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                                                                              0
## 3
                              1
                                   0
                                                       0
## 4
                      1
                              0
                                   0
                                                       0
                                                                 1
                                                                              0
## 5
                      3
                              1
                                   0
                                                       0
                                                                 3
                                                                              0
## 6
                              0
                                   0
                                                       0
                                                                              0
     Years reg
## 1 0.7619048
## 2 0.8412698
## 3 0.5396825
## 4 0.5238095
## 5 0.4761905
## 6 0.4761905
```

Random Forest

```
mtry.grid \leftarrow data.frame(mtry = c(2, 4, 8, 16, 20))
RF_tune <- randomForest(x = red_train_data, y= as.factor(train_election[[1]]), mtry = mtry.grid$mtry[3]
preds <- RF_tune$predicted</pre>
test_election <- as.factor(test_election[[1]])</pre>
misclassRF <- mean(preds != test_election)</pre>
probs <- predict(RF_tune, newdata = red_train_data, type="prob")[,2]</pre>
pred <- prediction(probs, test_election)</pre>
perf <- performance(pred, measure = "tpr", x.measure = "fpr")</pre>
# I know, the following code is bizarre. Just go with it.
auc <- performance(pred, measure = "auc")</pre>
auc <- auc@y.values[[1]]</pre>
roc.data <- data.frame(fpr=unlist(perf@x.values),</pre>
            tpr=unlist(perf@y.values),
           model="RF")
ggplot(roc.data, aes(x=fpr, ymin=0, ymax=tpr)) +
  geom_ribbon(alpha=0.2) +
  geom_line(aes(y=tpr)) +
  xlab("False Postive Rate") +
  ylab("True Positive Rate") +
```

```
geom_abline(slope=1, colour = "red") +
ggtitle(paste("Random forest ROC Curve w/ AUC=", round(auc,3)))+
theme_classic()
```

Random forest ROC Curve w/ AUC= 0.809



GBM

```
library(gbm)

## Warning: package 'gbm' was built under R version 3.3.3

## Loading required package: survival

## Loading required package: lattice

## Loading required package: splines

## Loading required package: parallel

## Loaded gbm 2.1.3

#train_election <- as.factor(train_election[[1]])

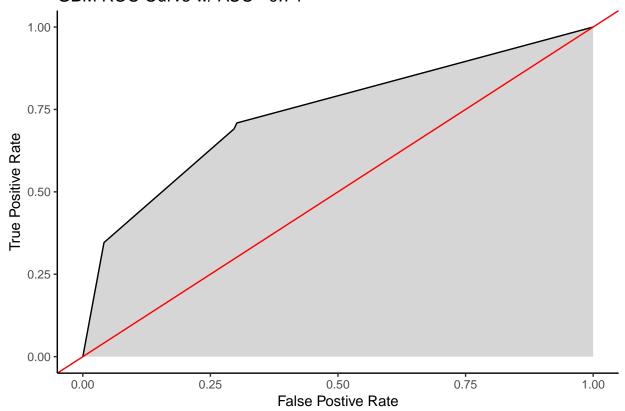
gbm_tune <- gbm.fit(x=red_train_data, y=train_election[[1]], verbose = F, n.trees = 500)

preds <- round(predict(gbm_tune,n.trees = 500, type="response"),0)

test_election <- monroe_data['X2014.11'][[1]]</pre>
```

```
misclassRF <- mean(preds != test_election)</pre>
probs <- predict(gbm_tune, newdata = red_train_data, n.trees = 200, type="response")</pre>
pred <- prediction(probs, test_election)</pre>
perf <- performance(pred, measure = "tpr", x.measure = "fpr")</pre>
# I know, the following code is bizarre. Just go with it.
auc <- performance(pred, measure = "auc")</pre>
auc <- auc@y.values[[1]]</pre>
roc.data <- data.frame(fpr=unlist(perf@x.values),</pre>
           tpr=unlist(perf@y.values),
           model="RF")
ggplot(roc.data, aes(x=fpr, ymin=0, ymax=tpr)) +
  geom_ribbon(alpha=0.2) +
  geom_line(aes(y=tpr)) +
  xlab("False Postive Rate") +
  ylab("True Positive Rate") +
  geom_abline(slope=1, colour = "red") +
  ggtitle(paste("GBM ROC Curve w/ AUC=", round(auc,3)))+
  theme_classic()
```

GBM ROC Curve w/ AUC= 0.74



SVM

```
library(kernlab)
##
## Attaching package: 'kernlab'
## The following object is masked from 'package:ggplot2':
##
##
       alpha
#train_election <- as.factor(train_election[[1]])</pre>
svm_tune <- ksvm(x=as.matrix(red_train_data), y=as.numeric(train_election[[1]]), kernel="rbfdot")</pre>
probs <- predict(svm_tune, newdata = red_train_data, type="response")</pre>
preds <- round(probs,0)</pre>
test_election <- monroe_data['X2014.11'][[1]]</pre>
misclassRF <- mean(preds != test_election)</pre>
pred <- prediction(probs, test_election)</pre>
perf <- performance(pred, measure = "tpr", x.measure = "fpr")</pre>
# I know, the following code is bizarre. Just go with it.
auc <- performance(pred, measure = "auc")</pre>
auc <- auc@y.values[[1]]</pre>
roc.data <- data.frame(fpr=unlist(perf@x.values),</pre>
           tpr=unlist(perf@y.values),
           model="RF")
ggplot(roc.data, aes(x=fpr, ymin=0, ymax=tpr)) +
  geom_ribbon(alpha=0.2) +
  geom_line(aes(y=tpr)) +
  xlab("False Postive Rate") +
  ylab("True Positive Rate") +
  geom_abline(slope=1, colour = "red") +
  ggtitle(paste("SVM ROC Curve w/ AUC=", round(auc,3)))+
  theme_classic()
```

