# Project Challenge

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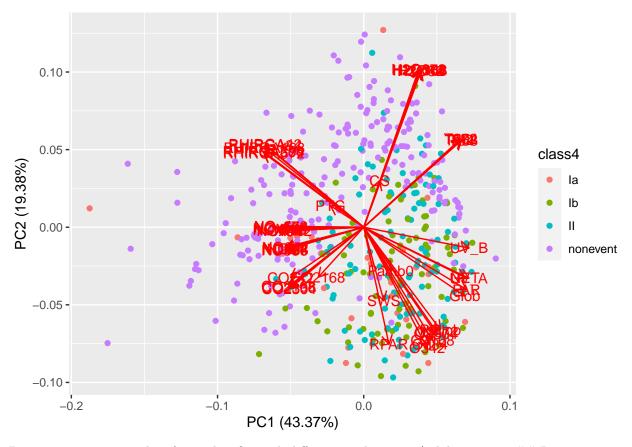
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#### Used libraries

```
library(ggfortify)
library(randomForest)
library(caret)
```

#### Read data

```
set.seed(42)
npf <- read.csv("npf_train.csv")</pre>
npf_test <- read.csv("npf_test_hidden.csv")</pre>
rownames(npf) <- npf[,"date"]</pre>
vars <- colnames(npf)[sapply(colnames(npf),</pre>
                                function(s) nchar(s)>5 && substr(s,nchar(s)-4,nchar(s))==".mean")]
vars2 <- colnames(npf_test)[sapply(colnames(npf_test),</pre>
                                function(s) nchar(s)>5 && substr(s,nchar(s)-4,nchar(s))==".mean")]
npf <- npf[,c(vars,"class4")]</pre>
npf_test <- npf_test[,c(vars2)]</pre>
## strip the trailing ".mean" to make the variable names prettier
colnames(npf)[1:length(vars)] <- sapply(colnames(npf)[1:length(vars)],</pre>
                                           function(s) substr(s,1,nchar(s)-5))
vars <- colnames(npf)[1:length(vars)]</pre>
colnames(npf_test)[1:length(vars2)] <- sapply(colnames(npf_test)[1:length(vars2)],</pre>
                                           function(s) substr(s,1,nchar(s)-5))
vars2 <- colnames(npf_test)[1:length(vars2)]</pre>
npf.pcA2 <- prcomp(scale(npf[,vars]))</pre>
npf.pcA2.withtest <- prcomp(scale(rbind(npf[,vars],npf_test[,vars])))</pre>
autoplot(npf.pcA2, data=npf, colour="class4", loadings=T, loadings.label=T)
```



Binary accuracy on random forest classifier with different sized training/validation sets: ## Binary accuracy (class 2)

## Accuracy of the estimate of accuracy

### Perplexity

## Multi-class accuracy (class4)

Multiclass accuracy on the random forest classifier:

```
set.seed(42)
# Calculates the accuracy to each class and the total accuracy
npf.pcA2 <- prcomp(npf[,vars], center=T, scale=T)</pre>
idx <- sample.int(nrow(npf),229)</pre>
training_set <- npf[ idx,]</pre>
validation_set <- npf[-idx,]</pre>
train.pc <- data.frame(npf.pcA2$x[idx,1:14])</pre>
train.pc$class4 <- npf[idx,]$class4</pre>
validate.pc <- data.frame(npf.pcA2$x[-idx,1:14])</pre>
validate.pc$class4 <- npf[-idx,]$class4</pre>
ctrl <- trainControl(method = "repeatedcv",</pre>
                       number = 10,
                       repeats = 10,
                       classProbs = TRUE)
rFClass4 <- train(factor(class4) ~ .,
                      method="rf",
```

```
data=train.pc,
                    trControl=ctrl)
probs4 <- predict(rFClass4, newdata = validate.pc, type = "prob")</pre>
pred <- predict(rFClass4, newdata = validate.pc)</pre>
confusionMatrix(pred, factor(validate.pc$class4))
## Confusion Matrix and Statistics
##
##
             Reference
## Prediction Ia Ib II nonevent
                2
                    0
                        0
     Ιa
                5 21 13
                                  2
##
     Th
##
     ΙI
                3 11 27
                                  3
##
                5
                   7 22
                                108
     nonevent
##
## Overall Statistics
##
##
                  Accuracy: 0.69
##
                    95% CI: (0.6257, 0.7492)
##
       No Information Rate: 0.4934
       P-Value [Acc > NIR] : 1.362e-09
##
##
##
                     Kappa: 0.4925
##
##
   Mcnemar's Test P-Value: 3.322e-05
##
## Statistics by Class:
##
##
                         Class: Ia Class: Ib Class: II Class: nonevent
## Sensitivity
                          0.133333
                                      0.5385
                                                 0.4355
                                                                 0.9558
                                      0.8947
                                                 0.8982
                                                                  0.7069
## Specificity
                          1.000000
                                      0.5122
                                                 0.6136
                                                                  0.7606
## Pos Pred Value
                          1.000000
## Neg Pred Value
                          0.942731
                                      0.9043
                                                 0.8108
                                                                  0.9425
## Prevalence
                          0.065502
                                      0.1703
                                                 0.2707
                                                                  0.4934
## Detection Rate
                          0.008734
                                      0.0917
                                                 0.1179
                                                                  0.4716
## Detection Prevalence 0.008734
                                      0.1790
                                                 0.1921
                                                                  0.6201
## Balanced Accuracy
                          0.566667
                                      0.7166
                                                 0.6668
                                                                  0.8313
train.pc <- data.frame(npf.pcA2.withtest$x[1:458,1:14])</pre>
train.pc$class4 <- npf$class4</pre>
test.pc <- data.frame(npf.pcA2.withtest$x[459:(458+nrow(npf_test)),1:14])
ctrl <- trainControl(method = "repeatedcv",</pre>
                     number = 10,
                      repeats = 10,
                      classProbs = TRUE)
rFClass4 <- train(factor(class4) ~ .,
                    method="rf",
                    data=train.pc,
                    trControl=ctrl)
pred_test4 <- predict(rFClass4, newdata = test.pc)</pre>
probs_test4 <- predict(rFClass4, newdata = test.pc, type = "prob")</pre>
```

```
length(which(pred_test4=="nonevent"))
## [1] 589
length(which(pred_test4=="Ia"))
## [1] 18
length(which(pred_test4=="Ib"))
## [1] 168
length(which(pred_test4=="II"))
## [1] 190
# Code to produce the answer-csv
# The first column "class4" in the answers.csv file is our
# prediction for the day, where class4 is Ia, Ib, II, or nonevent.
# The second column "p" is our prediction for probability Pr(class2=event)
# Creates the csv and adds the first line
# Change the string here to our guess of the accuracy
write.table(0.75,
                                 file="./answers.csv",
                                 append = F,
                                 sep=',',
                                 row.names=F,
                                 col.names=F)
# Write column names to the file
write.table(data.frame("class4","p"),
                              file="./answers.csv",
                              append = T,
                              sep=',',
                              row.names=F,
                               col.names=F)
# testing testing
#setwd()
\#probs\_test4 \leftarrow data.frame(c(0.1,0.2,0.5,0.1,0.5),c(0.6,0.05,0.1,0.2,0.05),c(0.1,0.7,0.2,0.2,0.15),c(0.6,0.05,0.1,0.2,0.05),c(0.1,0.7,0.2,0.2,0.15),c(0.6,0.05,0.1,0.2,0.05),c(0.1,0.7,0.2,0.2,0.15),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.2,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.1,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05,0.05),c(0.6,0.05),c(0.6,0.05),c(0.6,0.05),c(0.6,0.05),c(0.6,0.05),c(0
#colnames(probs_test4)<- c("Ia", "Ib", "II", "nonevent")</pre>
# Assume the class probabilities for each row are in probs_test4
classes_test4 <- colnames(probs_test4) [max.col(probs_test4, ties.method = "first")]</pre>
# Write the class predictions and probabilities
write.table(data.frame(classes_test4, (probs_test4$Ia+probs_test4$Ib+probs_test4$II)),
                               file="./answers.csv",
                              append = T,
                              sep=',',
                              row.names=F,
                               col.names=F)
```