

## Session 20 Assignment

Weight Lifting Exercise

This human activity recognition research has traditionally focused on discriminating between different activities, i.e. to predict "which" activity was performed at a specific point in time (like with the Daily Living Activities dataset above). The approach we propose for the Weight Lifting Exercises dataset is to investigate "how (well)" an activity was performed by the wearer. The "how (well)" investigation has only received little attention so far, even though it potentially provides useful information for a large variety of applications, such as sports training.

- 1. Use the below given data set Data Set
- 2. Perform the below given activities:
- a. Create classification model using different random forest models
- b. Verify model goodness of fit
- c. Apply all the model validation techniques
- d. Make conclusions
- e. Plot importance of variables

setwd("C:/Users/Seshan/Desktop")

library(readr)

```
Weight_lift <- read.csv("Weight lift.csv")</pre>
View(Weight_lift)
str(Weight_lift)
data<-Weight_lift
# load libraries
library(caret)
library(randomForest)
library(rpart)
library(rpart.plot)
library(ggplot2)
library(lattice)
library(rattle)
library(C50)
#install.package('devtools') # Only needed if you dont have this installed.
library(devtools)
install_github('adam-m-mcelhinney/helpRFunctions')
library(helpRFunctions)
names(data)
dim(data)
pairs(data[1:10])
# enable multi-core processing
library(doParallel)
cl <- makeCluster(detectCores())</pre>
registerDoParallel()
```

```
set.seed(12345)
dataTrain<-data[1:4004,]
dataTest<-data[4005:4024,]
head(dataTrain)
head(dataTest)
indexNA <- as.vector(sapply(dataTrain[,1:158],function(x) {length(which(is.na(x)))!=0}))
dataTrain <- dataTrain[,!indexNA]
train_control<- trainControl(method="cv", number=10)</pre>
model<- train(classe ~., data=dataTrain,trControl=train_control, method="rf")
model
# make predictions
predictions<- predict(model,dataTrain)</pre>
# append predictions
pred<- cbind(dataTrain,predictions)</pre>
# summarize results
confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)
confusionMatrix
#how do we create a cross validation scheme
control <- trainControl(method = 'repeatedcv',
             number = 10,
             repeats = 3)
seed <-7
metric <- 'Accuracy'
set.seed(seed)
```

```
mtry <- sqrt(ncol(dataTrain))</pre>
tunegrid <- expand.grid(.mtry=mtry)</pre>
rf_default <- train(pitch_belt~.,
           data = dataTrain,
           method = 'rf',
           metric = 0,
           tuneGrid = tunegrid,
           trControl = control)
print(rf_default)
#-----
# make predictions
predictions<- predict(rf_default,dataTest)</pre>
# append predictions
pred<- cbind(dataTest,predictions)</pre>
# summarize results
confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)</pre>
confusionMatrix
varImp(rf_default)
#-----
# random search for parameters
control <- trainControl(method = 'repeatedcv',
             number = 10,
             repeats = 3,
             search = 'random')
```

```
# make predictions
predictions<- predict(rf_default,dataTest)</pre>
# append predictions
pred<- cbind(dataTest,predictions)</pre>
# summarize results
#confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)
confusionMatrix
varImp(random)
#-----
# Grid search
control <- trainControl(method = 'repeatedcv',</pre>
            number = 10,
             repeats = 3,
             search = 'grid')
set.seed(seed)
tunegrid <- expand.grid(.mtry=c(1:80))</pre>
mtry <- sqrt(ncol(x))
rf_gridsearch <- train(~.,
            data = dataTrain[1:200,],
            method = 'rf',
             metric = 0,
            tuneGrid = tunegrid,
```

```
trControl = control)
print(rf_gridsearch)
plot(rf_gridsearch)
# make predictions
predictions<- predict(rf_gridsearch,dataTest)</pre>
# append predictions
pred<- cbind(dataTest,predictions)</pre>
# summarize results
confusionMatrix<- confusionMatrix(pred$predictions,pred$pitch_belt)
confusionMatrix
varImp(rf_gridsearch)
 # Boosting
# Boosting model requires three things
#1- a loss function to be optimized
#2- a weak learner to make predictions
#3- an additive model to add the weak learners to minimize the loss function
# gradient boosting
control <- trainControl(method = 'repeatedcv',
```

```
number = 5,
             repeats = 3,
             search = 'grid')
seed <- 7
library(C50)
set.seed(seed)
metric <- 'Accuracy'
gbm_mod <- train(pitch_belt~.,
         data = dataTrain,
         method = 'gbm',
         metric = 0,
         trControl = control)
print(gbm_mod)
plot(gbm_mod)
summary(gbm_mod)
# make predictions
predictions<- predict(gbm_mod,dataTest)</pre>
# append predictions
pred<- cbind(dataTest,predictions)</pre>
# summarize results
confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)</pre>
```

```
> setwd("C:/Users/Seshan/Desktop")
> library(readr)
> Weight_lift <- read.csv("Weight lift.csv")</pre>
> View(Weight_lift)
> str(Weight_lift)
'data.frame': 4024 obs. of 158 variables:
                        : Factor w/ 5 levels "adelmo", "carlitos", ...: 3 3 3
$ user_name
3 3 3 3 3 3 ...
$ raw_timestamp_part_1
                        : int 1322489729 1322489729 1322489729
1322489729 1322489729 1322489729 1322489729 1322489729 ...
                        : int 34670 62641 70653 82654 90637 170626 190665
$ raw_timestamp_part_2
242723 267551 274689 ...
$ cvtd_timestamp
                        : Factor w/ 7 levels "2/12/2011 13:35",..: 2 2 2 2
2 2 2 2 2 2 ...
                        : Factor w/ 2 levels "no", "yes": 1 1 1 1 1 1 1 1 1
$ new_window
1 ...
$ num_window
                              1111111111...
                        : int
                              3.7 3.66 3.58 3.56 3.57 3.45 3.31 2.91 2.31
$ roll_belt
                        : num
2 ...
                              41.6 42.8 43.7 44.4 45.1 45.6 46.2 46.9 47.
$ pitch_belt
                        : num
4 47.7 ...
                              -82.8 -82.5 -82.3 -82.1 -81.9 -81.9 -81.9 -
$ yaw_belt
                        : num
82.2 -82.6 -82.8 ...
$ total_accel_belt
                        : int
                              3 2 1 1 1 1 3 4 2 3 ...
                              -1.04 -1.04 -1.04 -1.04 -1.04 ...
$ kurtosis_roll_belt
                        : num
                              -0.391 -0.391 -0.391 -0.391 ...
$ kurtosis_picth_belt
                        : num
                              0.00541 \ 0.00541 \ 0.00541 \ 0.00541 \ 0.00541 \ \dots
$ skewness_roll_belt
                        : num
$ skewness_roll_belt.1
                        : num
                              0.0451 0.0451 0.0451 0.0451 0.0451 ...
$ max_roll_belt
                        : num
                              1 -4.1 ...
 $ max_picth_belt
                              20 20 20 20 20 20 20 20 20 20 ...
                        : int
 $ max_yaw_belt
                        : num
                              -1 -1 -1 -1 -1 -1 -1 -1 -1 ...
                              -7.25 -7.25 -7.25 -7.25 -7.25 - 7.25 -
$ min_roll_belt
                        : num
7.25 -7.25 -7.25 ...
 $ min_pitch_belt
                        : int
                              18 18 18 18 18 18 18 18 18 18 ...
                              -1 -1 -1 -1 -1 -1 -1 -1 -1 ...
 $ min_yaw_belt
                        : num
 $ amplitude_roll_belt
                              1.34 1.34 1.34 1.34 ...
                        : num
 $ amplitude_pitch_belt
                              2 2 2 2 2 2 2 2 2 2 ...
                        : int
 $ amplitude_yaw_belt
                        : int
                              0000000000...
 $ var_total_accel_belt
                              0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.3 0.3 ...
                        : num
$ avg_roll_belt
                              122 122 122 122 122 .
                         num
                              $ stddev_roll_belt
                         num
 $ var_roll_belt
                              num
5 0.35 ...
 $ avg_pitch_belt
                        : num
                              25.8 25.8 25.8 25.8 25.8 ...
                              $ stddev_pitch_belt
                        : num
5 0.35 ...
 $ var_pitch_belt
                              : num
                              -4.95 -4.95 -4.95 -4.95 -4.95 -4.95 -
 $ avg_yaw_belt
                        : num
4.95 -4.95 -4.95 ...
                        $ stddev_yaw_belt
```

```
$ var_yaw_belt
7 0.17 ...
                                 2.02 1.96 1.88 1.8 1.77 1.75 1.78 1.75 1.65
 $ gyros_belt_x
                          : num
1.48 ...
                                 0.18 0.14 0.08 0.03 0 -0.03 -0.06 -0.06 -0.
 $ gyros_belt_y
                          : num
03 -0.06 ...
                                 0.02 0.05 0.05 0.08 0.13 0.16 0.15 0.23 0.3
$ gyros_belt_z
                          : num
3 0.21 ...
$ accel_belt_x
                          : int
                                 -3 -2 -2 -6 -4 1 1 2 -1 -18 ...
                                 -18 -13 -6 -5 -9 -9 -24 -36 -19 18 ...
 $ accel_belt_y
                          : int
                                 22 16 8 7 0 -5 -8 -9 -7 1 ...
 $ accel_belt_z
                          : int
                                 387 405 409 422 418 432 438 440 443 449 ...
$ magnet_belt_x
                          : int
                                 525 512 511 513 508 510 508 503 507 499 ...
$ magnet_belt_y
                         : int
                                 -267 -254 -244 -221 -208 -189 -176 -163 -14
 $ magnet_belt_z
                          : int
0 -132 ...
$ roll_arm
                          : num
                                 132 129 125 120 115 110 104 98.6 93.2 88.5
 $ pitch_arm
                                 -43.7 -45.3 -46.8 -48.1 -49.1 -49.6 -49.9 -
                          : num
49.7 -49 -48.1 ...
                                 -53.6 -49 -43.7 -38.1 -31.7 -25.8 -18.5 -11
$ yaw_arm
                          : num
.4 -4.49 1.82 ...
$ total_accel_arm
                                 38 38 35 35 34 33 29 28 27 22 ...
                          : int
 $ var_accel_arm
                                 65.1 65.1 65.1 65.1 65.1 ...
                          : num
$ avg_roll_arm
                                 76.2 76.2 76.2 76.2 76.2 ...
                          : num
 $ stddev_roll_arm
                                 16.1 16.1 16.1 16.1 16.1 ...
                          : num
$ var_roll_arm
                                 259 259 259 259 ...
                          : num
$ avg_pitch_arm
                         : num
                                 -10.2 -10.2 -10.2 -10.2 -10.2 ...
$ stddev_pitch_arm
                         : num
                                 10.7 10.7 10.7 10.7 10.7 ...
                                 114 114 114 114 114 ...
$ var_pitch_arm
                         : num
 $ avg_yaw_arm
                         : num
                                 19.1 19.1 19.1 19.1 19.1 ...
 $ stddev_yaw_arm
                                 35.9 35.9 35.9 35.9 35.9 ...
                         : num
                                 1287 1287 1287 1287 1287 ...
$ var_yaw_arm
                         : num
                                 2.65 2.79 2.91 3.08 3.2 3.31 3.5 3.53 3.4 3
$ gyros_arm_x
                          : num
.48 ...
                                 -0.61 -0.64 -0.69 -0.72 -0.77 -0.83 -0.83 -
$ gyros_arm_y
                          : num
0.83 -0.83 -0.8 ...
                                 -0.02 -0.11 -0.15 -0.23 -0.25 -0.3 -0.31 -0
$ gyros_arm_z
                          : num
.21 -0.11 -0.15 ...
                                 143 146 156 158 163 160 165 153 143 135 ...
$ accel_arm_x
                          : int
$ accel_arm_y
                          : int
                                 30 35 44 52 55 59 67 70 78 96 ...
                                 -346 -339 -307 -305 -288 -274 -225 -218 -20
$ accel_arm_z
                          : int
5 -134 ...
$ magnet_arm_x
                          : int
                                 556 599 613 646 670 696 721 725 740 741 ...
                                 -205 -206 -198 -186 -175 -174 -161 -152 -13
$ magnet_arm_y
                          : int
3 -115 ...
$ magnet_arm_z
                          : int
                                 -374 -335 -319 -268 -241 -193 -121 -105 -43
14 ...
 $ kurtosis_roll_arm
                                 -1.18 -1.18 -1.18 -1.18 -1.18 ...
                          : num
 $ kurtosis_picth_arm
                          : num
                                 -0.969 -0.969 -0.969 -0.969 ...
                          : num
                                 -0.87 -0.87 -0.87 -0.87 -0.87 ...
$ kurtosis_yaw_arm
$ skewness_roll_arm
                                 0.124 0.124 0.124 0.124 0.124 ...
                          : num
                                 -0.103 -0.103 -0.103 -0.103 ...
$ skewness_pitch_arm
                          : num
$ skewness_yaw_arm
                          : num
                                 0.0598 0.0598 0.0598 0.0598 0.0598 ...
$ max_roll_arm
                          : num
                                 5 8.45 ...
                                77.2 77.2 77.2 77.2 77.2 ...
 $ max_picth_arm
                         : num
                                 38 38 38 38 38 38 38 38 38 ...
 $ max_yaw_arm
                          : int
```

```
-33.6 -33.6 -33.6 -33.6 -33.6 -33.6 -
 $ min_roll_arm
                         : num
33.6 -33.6 -33.6 ...
                                -58.6 -58.6 -58.6 -58.6 -58.6 -58.6 -
 $ min_pitch_arm
                         : num
58.6 -58.6 -58.6 ...
                                10 10 10 10 10 10 10 10 10 10 ...
$ min_yaw_arm
                         : int
$ amplitude_roll_arm
                                36.9 36.9 36.9 36.9 ...
                         : num
 $ amplitude_pitch_arm
                                122 122 122 122 ...
                         : num
 $ amplitude_yaw_arm
                                27 27 27 27 27 27 27 27 27 27 ...
                         : int
                                51.2 55.8 55.5 55.9 55.2 ...
 $ roll_dumbbell
                          num
 $ pitch_dumbbell
                                11.7 9.65 6.88 11.08 11.43 ...
                           num
                                104.3 100.2 101.1 99.8 100.4 ...
 $ yaw_dumbbell
                          num
 $ kurtosis_roll_dumbbell
                         : num
                                -0.0959 -0.0959 -0.0959 -0.0959 ...
 $ kurtosis_picth_dumbbell : num
                                -0.442 -0.442 -0.442 -0.442 ...
 $ skewness_roll_dumbbell
                                0.0819 0.0819 0.0819 0.0819 0.0819 0.0819 0
                         : num
.0819 0.0819 0.0819 0.0819
 $ skewness_pitch_dumbbell : num
                                -0.216 -0.216 -0.216 -0.216 -0.216 -
0.216 -0.216 -0.216 -0.216 ...
 $ max_roll_dumbbell
                                41.9 41.9 41.9 41.9 ...
                         : num
$ max_picth_dumbbell
                                133 133 133 133 133 133 133 133 133 ...
                         : num
$ max_yaw_dumbbell
                         : num
                                1 -0.1 ...
 $ min_roll_dumbbell
                                -26.8 -26.8 -26.8 -26.8 ...
                         : num
 $ min_pitch_dumbbell
                         : num
                                2 20.2 ...
 $ min_yaw_dumbbell
                                : num
1 -0.1 ...
 $ amplitude_roll_dumbbell : num
                                55.7 55.7 55.7 55.7 55.7 ...
                                54.7 54.7 54.7 54.7 54.7 ...
 $ amplitude_pitch_dumbbell: num
 $ amplitude_yaw_dumbbell
                               0 0 0 0 0 0 0 0 0 0 ...
                        : int
 $ total accel dumbbell
                               4 4 4 5 4 4 4 4 4 4 ...
                         : int
                               2.42 2.42 2.42 2.42 ...
 $ var_accel_dumbbell
                         : num
 $ avg_roll_dumbbell
                               -5.12 -5.12 -5.12 -5.12 ...
                         : num
  [list output truncated]
> data<-Weight_lift</pre>
> # load libraries
> library(caret)
> library(randomForest)
> library(rpart)
> library(rpart.plot)
> library(ggplot2)
> library(lattice)
> library(rattle)
>
> library(C50)
> #install.package('devtools') # Only needed if you dont have this installed.
> library(devtools)
> install_github('adam-m-mcelhinney/helpRFunctions')
Skipping install of 'helpRFunctions' from a github remote, the SHA1 (9eb16e8c
) has not changed since last install.
  Use `force = TRUE` to force installation
> library(helpRFunctions)
> names(data)
  [1] "user_name"
                               "raw_timestamp_part_1"
                                                         "raw_timestamp_pa
rt_2"
                               "new_window"
  [4] "cvtd_timestamp"
                                                         "num_window"
  [7] "roll_belt"
                               "pitch_belt"
                                                         "yaw_belt"
```

| [10]   | "total_accel_belt"  | "kurtosis_roll_belt"   | "kurtosis_picth_b   |
|--|---|--|---|
| elt"<br>[13]<br>[16]<br>[19]   | <pre>"skewness_roll_belt" "max_picth_belt" "min_pitch_belt"</pre>   | "skewness_roll_belt.1" "max_yaw_belt" "min_yaw_belt"   | "max_roll_belt" "min_roll_belt" "amplitude_roll_b   |
| elt"<br>[22]<br>belt"  | "amplitude_pitch_belt"  | "amplitude_yaw_belt"   | "var_total_accel_   |
| [25]<br>[28]<br>[31]<br>[34]<br>[40]<br>[43]<br>[46]<br>[49]<br>[52]<br>[55]<br>[58]<br>[61] | "avg_roll_belt" "avg_pitch_belt" "avg_yaw_belt" "gyros_belt_x" "accel_belt_x" "magnet_belt_x" "roll_arm" "total_accel_arm" "stddev_roll_arm" "stddev_pitch_arm" "stddev_yaw_arm" "gyros_arm_y" "accel_arm_y" "magnet_arm_y" | "stddev_roll_belt" "stddev_pitch_belt" "stddev_yaw_belt" "gyros_belt_y" "accel_belt_y" "magnet_belt_y" "pitch_arm" "var_accel_arm" "var_roll_arm" "var_pitch_arm" "var_yaw_arm" "gyros_arm_z" "accel_arm_z" "magnet_arm_z" | "var_roll_belt"  "var_pitch_belt"  "var_yaw_belt"  "gyros_belt_z"  "accel_belt_z"  "yaw_arm"  "avg_roll_arm"  "avg_pitch_arm"  "avg_yaw_arm"  "gyros_arm_x"  "accel_arm_x"  "magnet_arm_x"  "kurtosis_roll_ar |
| m"<br>[67]   | "kurtosis_picth_arm"  | "kurtosis_yaw_arm"   | "skewness_roll_ar   |
| [73]<br>[76]   | <pre>"skewness_pitch_arm" "max_picth_arm" "min_pitch_arm"</pre>   | "skewness_yaw_arm"<br>"max_yaw_arm"<br>"min_yaw_arm"   | "max_roll_arm"<br>"min_roll_arm"<br>"amplitude_roll_a   |
|  | "pitch_dumbbell"  | "amplitude_yaw_arm"<br>"yaw_dumbbell"  | "roll_dumbbell"<br>"kurtosis_roll_du  |
| mbbell<br>[85]<br>umbbel   | "kurtosis_picth_dumbbell"   | "skewness_roll_dumbbell"   | "skewness_pitch_d   |
| [88]   | "max_roll_dumbbell"   | "max_picth_dumbbell"   | "max_yaw_dumbbell   |
| [91]   | "min_roll_dumbbell"   | "min_pitch_dumbbell"   | "min_yaw_dumbbell   |
| [94]<br>mbbell   | "amplitude_roll_dumbbell"   | "amplitude_pitch_dumbbell"   | "amplitude_yaw_du   |
|  | "total_accel_dumbbell"  | "var_accel_dumbbell"   | "avg_roll_dumbbel   |
| -  | "stddev_roll_dumbbell"  | "var_roll_dumbbell"  | "avg_pitch_dumbbe   |
| [103]  | "stddev_pitch_dumbbell"   | "var_pitch_dumbbell"   | "avg_yaw_dumbbell   |
| [106]  | "stddev_yaw_dumbbell"   | "var_yaw_dumbbell"   | "gyros_dumbbell_x   |
| [109]  | "gyros_dumbbell_y"  | "gyros_dumbbell_z"   | "accel_dumbbell_x   |
| [112]<br>x"  | "accel_dumbbell_y"  | "accel_dumbbell_z"   | "magnet_dumbbell_   |
| [115]<br>[118]   | "magnet_dumbbell_y"<br>"pitch_forearm"  | <pre>"magnet_dumbbell_z" "yaw_forearm"</pre>   | "roll_forearm"<br>"kurtosis_roll_fo   |
| rearm'<br>[121]<br>orearm  | "kurtosis_picth_forearm"  | "skewness_roll_forearm"  | "skewness_pitch_f   |

```
[124] "max_roll_forearm"
                                   "max_picth_forearm"
                                                                "max_yaw_forearm"
      "min_roll_forearm"
                                   "min_pitch_forearm"
                                                                "min_yaw_forearm"
[127]
[130] "amplitude_roll_forearm"
                                   "amplitude_pitch_forearm"
                                                                "amplitude_yaw_fo
rearm'
[133] "total_accel_forearm"
                                   "var accel forearm"
                                                                "avg_roll_forearm
[136] "stddev_roll_forearm"
                                   "var roll forearm"
                                                                "avg_pitch_forear
[139] "stddev_pitch_forearm"
                                   "var_pitch_forearm"
                                                                "avg_yaw_forearm"
[142] "stddev_yaw_forearm"
                                                                "gyros_forearm_x"
                                   "var_yaw_forearm"
[145] "gyros_forearm_y"
                                   "gyros_forearm_z"
                                                                "accel_forearm_x"
[148] "accel_forearm_y"
                                   "accel_forearm_z"
                                                                "magnet_forearm_x
[151] "magnet_forearm_y"
                                   "magnet_forearm_z"
                                                                "accel_forearm_y.
[154] "accel_forearm_z.1"
                                   "magnet_forearm_x.1"
                                                                "magnet_forearm_y
.1"
                                   "classe"
[157] "magnet_forearm_z.1"
> dim(data)
[1] 4024 158
> pairs(data[1:10])
> # enable multi-core processing
> library(doParallel)
> cl <- makeCluster(detectCores())</pre>
> registerDoParallel()
> set.seed(12345)
> dataTrain<-data[1:4004,]</pre>
> dataTest<-data[4005:4024,]</pre>
> head(dataTrain)
  user_name raw_timestamp_part_1 raw_timestamp_part_2
                                                            cvtd_timestamp new_wi
ndow
1
     eurico
                       1322489729
                                                   34670 28/11/2011 14:15
no
     eurico
                       1322489729
                                                   62641 28/11/2011 14:15
2
no
     eurico
                       1322489729
                                                   70653 28/11/2011 14:15
3
nο
     eurico
                                                   82654 28/11/2011 14:15
                       1322489729
4
no
5
     eurico
                       1322489729
                                                   90637 28/11/2011 14:15
no
                                                  170626 28/11/2011 14:15
     eurico
                       1322489729
6
no
  num_window roll_belt pitch_belt yaw_belt total_accel_belt kurtosis_roll_bel
t
1
                   3.70
                               41.6
                                        -82.8
                                                               3
            1
                                                                           -1.0356
6
2
            1
                   3.66
                               42.8
                                        -82.5
                                                               2
                                                                           -1.0356
6
3
            1
                   3.58
                               43.7
                                        -82.3
                                                              1
                                                                           -1.0356
6
4
            1
                   3.56
                               44.4
                                        -82.1
                                                               1
                                                                           -1.0356
6
5
                               45.1
            1
                   3.57
                                        -81.9
                                                                           -1.0356
                                                              1
6
```

```
6
                    3.45
                                45.6
                                         -81.9
                                                                              -1.0356
            1
                                                                 1
  kurtosis_picth_belt skewness_roll_belt skewness_roll_belt.1 max_roll_belt
               -0.39133
                                    0.005406
1
                                                           0.045115
                                                           0.045115
                                                                               -4.1
2
               -0.39133
                                    0.005406
3
               -0.39133
                                    0.005406
                                                           0.045115
                                                                               -4.1
4
                                    0.005406
               -0.39133
                                                           0.045115
                                                                               -4.1
5
               -0.39133
                                    0.005406
                                                           0.045115
                                                                               -4.1
                                    0.005406
                                                           0.045115
6
               -0.39133
                                                                               -4.1
  max_picth_belt max_yaw_belt min_roll_belt min_pitch_belt min_yaw_belt
                                           -7.25
1
                                                               18
                20
                              -1
2
                20
                                           -7.25
                                                               18
                              -1
                                                                             -1
3
                20
                              -1
                                           -7.25
                                                               18
                                                                             -1
4
                20
                              -1
                                           -7.25
                                                               18
                                                                             -1
5
                20
                              -1
                                           -7.25
                                                               18
                                                                             -1
                20
                              -1
                                           -7.25
                                                               18
                                                                             -1
  amplitude_roll_belt amplitude_pitch_belt amplitude_yaw_belt var_total_accel
unp
_belt
1
                                              2
                  1.345
                                                                   0
0.3
2
                  1.345
                                              2
                                                                   0
0.3
                                              2
                                                                   0
                  1.345
3
0.3
                  1.345
                                              2
                                                                   0
0.3
                                              2
                                                                   0
                  1.345
0.3
                                              2
                  1.345
                                                                   0
6
0.3
  avg_roll_belt stddev_roll_belt var_roll_belt avg_pitch_belt stddev_pitch_be
٦t
                                               0.35
                                                               25.75
           121.9
                                 0.6
1
35
                                               0.35
                                                               25.75
2
           121.9
                                 0.6
                                                                                    0.
35
           121.9
                                0.6
                                               0.35
                                                               25.75
                                                                                    0.
3
35
           121.9
                                0.6
                                               0.35
                                                               25.75
                                                                                    0.
4
35
                                 0.6
5
           121.9
                                               0.35
                                                               25.75
                                                                                    0.
35
                                0.6
6
           121.9
                                               0.35
                                                               25.75
                                                                                    0.
35
  var_pitch_belt avg_yaw_belt stddev_yaw_belt var_yaw_belt gyros_belt_x gyros
_belt_y
\overline{1}
               0.1
                           -4.95
                                               0.4
                                                            0.17
                                                                           2.02
0.18
               0.1
                           -4.95
                                               0.4
                                                            0.17
                                                                           1.96
2
0.14
               0.1
                           -4.95
                                               0.4
                                                            0.17
                                                                           1.88
0.08
               0.1
                           -4.95
                                               0.4
                                                            0.17
                                                                           1.80
0.03
               0.1
                           -4.95
                                               0.4
                                                            0.17
                                                                           1.77
0.00
```

| 6<br>-0.03         | 0.1                     | -4.95              | 5                  | 0.4      | 4                  | 0.17                  | 1.75                 |
|--------------------|-------------------------|--------------------|--------------------|----------|--------------------|-----------------------|----------------------|
| gyros_k<br>lt_y    | pelt_z accel            | _belt_x a          | accel_bel          | t_y acce | el_belt_z ı        | magnet_be             | lt_x magnet_be       |
| 1                  | 0.02                    | -3                 |                    | -18      | 22                 |                       | 387                  |
| 525<br>2           | 0.05                    | -2                 |                    | -13      | 16                 |                       | 405                  |
| 512<br>3           | 0.05                    | -2                 |                    | -6       | 8                  |                       | 409                  |
| 511<br>4           | 0.08                    | -6                 |                    | -5       | 7                  |                       | 422                  |
| 513<br>5           | 0.13                    | -4                 |                    | -9       | 0                  |                       | 418                  |
| 508<br>6           | 0.16                    | 1                  |                    | -9       | -5                 |                       | 432                  |
|                    | _belt_z roll            | _arm pito          | ch_arm ya          | w_arm to | otal_accel         | _arm var_a            | accel_arm avg_       |
| roll_arm<br>1      | -267                    | 132                | -43.7              | -53.6    |                    | 38                    | 65.0977              |
| 76.22175<br>2      | -254                    | 129                | -45.3              | -49.0    |                    | 38                    | 65.0977              |
| 76.22175<br>3      | -244                    | 125                | -46.8              | -43.7    |                    | 35                    | 65.0977              |
| 76.22175<br>4      | -221                    | 120                | -48.1              | -38.1    |                    | 35                    | 65.0977              |
| 76.22175<br>5      | -208                    | 115                | -49.1              | -31.7    |                    | 34                    | 65.0977              |
| 76.22175<br>6      | -189                    | 110                | -49.6              | -25.8    |                    | 33                    | 65.0977              |
| 76.22175<br>stddev | _roll_arm va            | r_roll_ar          | rm avq_pi          | tch_arm  | stddev_pi          | tch_arm v             | ar_pitch_arm         |
| 1                  | 16.1039                 | 259.359            | 99 -               | 10.1695  | 1                  | 0.66725               | 113.7978             |
| 2                  | 16.1039<br>16.1039      | 259.359<br>259.359 |                    | 10.1695  |                    | 0.66725<br>0.66725    | 113.7978<br>113.7978 |
| 4                  | 16.1039                 | 259.359            | 99 -               | 10.1695  | 1                  | 0.66725               | 113.7978             |
| 5                  | 16.1039                 | 259.359            |                    | 10.1695  |                    | 0.66725               | 113.7978             |
| 6                  | 16.1039<br>w_arm stddev | 259.359            |                    | 10.1695  |                    | 0.66725               | 113.7978             |
|                    | .0615                   | 35.8809            | 1287.              | 463      | 2.65               | 9103_a1111_5<br>-0.63 |                      |
| 2 19               | .0615                   | 35.8809            | 1287.              | 463      | 2.79               |                       |                      |
|                    | .0615                   | 35.8809            | 1287.              |          | 2.91               | -0.69                 |                      |
|                    | .0615<br>.0615          | 35.8809            | 1287.              |          | 3.08               | -0.72<br>-0.73        |                      |
|                    | .0615                   | 35.8809<br>35.8809 | 1287.<br>1287.     |          | 3.20<br>3.31       | -0.7                  |                      |
| -                  | arm_x accel_            |                    |                    |          |                    |                       |                      |
| 1                  | 143                     | 30                 | -346               |          | 556                | -205                  | -374                 |
| 2                  | 146                     | 35                 | -339               |          | 599                | -206                  | -335                 |
| 3                  | 156                     | 44                 | -307               |          | 613                | -198                  | -319                 |
| 4                  | 158                     | 52                 | -305               |          | 646                | -186                  | -268                 |
| 5<br>6             | 163<br>160              | 55<br>59           | -288<br>-274       |          | 670<br>696         | -175<br>-174          | -241<br>-193         |
|                    | is_roll_arm             |                    | _picth_ar          |          | sis_yaw_ar         |                       | s_roll_arm           |
| 1 2                | -1.18224                |                    | -0.9691            |          | -0.8697            |                       | 0.12353              |
| 2                  | -1.18224                |                    | -0.9691            |          | -0.8697            |                       | 0.12353              |
| 3                  | -1.18224                |                    | -0.9691            |          | -0.8697            |                       | 0.12353              |
| 4<br>5             | -1.18224<br>-1.18224    |                    | -0.9691<br>-0.9691 |          | -0.8697<br>-0.8697 |                       | 0.12353<br>0.12353   |
| ,                  | 1.10224                 |                    | 0.5051             |          | 0.0057             | •                     | O: 12333             |

```
6
                                 -0.96912
                                                    -0.86977
                                                                         0.12353
            -1.18224
                        skewness_yaw_arm max_roll_arm max_picth_arm max_yaw_arm
  skewness_pitch_arm
1
             -0.10319
                                0.059765
                                                   8.45
                                                                  77.25
                                                                                  38
2
                                                                  77.25
             -0.10319
                                0.059765
                                                   8.45
                                                                                  38
3
             -0.10319
                                0.059765
                                                   8.45
                                                                  77.25
                                                                                  38
4
                                                                                  38
             -0.10319
                                0.059765
                                                   8.45
                                                                  77.25
5
                                0.059765
                                                   8.45
                                                                  77.25
                                                                                  38
             -0.10319
6
             -0.10319
                                0.059765
                                                   8.45
                                                                  77.25
                                                                                  38
  min_roll_arm min_pitch_arm min_yaw_arm amplitude_roll_arm amplitude_pitch_a
rm
          -33.6
                         -58.6
                                          10
                                                           36.945
1
                                                                                  121
. 5
2
          -33.6
                         -58.6
                                          10
                                                           36.945
                                                                                  121
. 5
3
          -33.6
                         -58.6
                                          10
                                                           36.945
                                                                                  121
. 5
                         -58.6
                                          10
                                                           36.945
                                                                                  121
4
          -33.6
. 5
5
          -33.6
                         -58.6
                                          10
                                                           36.945
                                                                                  121
. 5
          -33.6
                         -58.6
                                          10
                                                           36.945
                                                                                  121
6
. 5
  amplitude_yaw_arm roll_dumbbell pitch_dumbbell yaw_dumbbell kurtosis_roll_d
umbbell
                   27
                            51.23554
                                           11.698847
                                                          104.26473
0.09595
                   27
                            55.82442
                                            9.645819
                                                          100.22805
0.09595
                   27
                           55.46983
                                            6.875244
                                                          101.08411
0.09595
                   27
                            55.94486
                                           11.079297
                                                           99.78456
0.09595
                                           11.426833
                                                          100.42258
5
                   27
                            55.21174
0.09595
                   27
                            54.24731
                                           14.126636
                                                          100.61574
0.09595
  kurtosis_picth_dumbbell skewness_roll_dumbbell
                                                        skewness_pitch_dumbbell
                    -0.4422
                                                                          -0.216
                                               0.0819
2
3
                    -0.4422
                                               0.0819
                                                                          -0.216
                    -0.4422
                                               0.0819
                                                                          -0.216
4
                    -0.4422
                                               0.0819
                                                                          -0.216
5
                    -0.4422
                                               0.0819
                                                                          -0.216
6
                    -0.4422
                                               0.0819
                                                                          -0.216
  max_roll_dumbbell max_picth_dumbbell
                                           max_yaw_dumbbell min_roll_dumbbell
               41.85
                                       133
                                                         -0.1
                                                                          -26.75
1
2
               41.85
                                       133
                                                         -0.1
                                                                          -26.75
3
                                       133
                                                         -0.1
               41.85
                                                                           -26.75
4
5
                                                                          -26.75
                                       133
                                                         -0.1
               41.85
               41.85
                                       133
                                                         -0.1
                                                                          -26.75
               41.85
                                       133
                                                         -0.1
                                                                          -26.75
  min_pitch_dumbbell min_yaw_dumbbell amplitude_roll_dumbbell amplitude_pitch
_dumbbell
                 20.2
                                     -0.1
                                                              55.71
1
54.74
                  20.2
                                     -0.1
                                                              55.71
54.74
```

```
20.2
                                    -0.1
                                                              55.71
54.74
                 20.2
                                    -0.1
                                                              55.71
4
54.74
                  20.2
                                    -0.1
                                                              55.71
54.74
                 20.2
                                                              55.71
                                    -0.1
6
54.74
  amplitude_yaw_dumbbell total_accel_dumbbell var_accel_dumbbell avg_roll_dum
                         0
                                                 4
                                                               2.41635
                                                                                  -5.
11805
                         0
                                                 4
                                                               2.41635
                                                                                  -5.
11805
                         0
                                                 4
                                                               2.41635
                                                                                  -5.
3
11805
                         0
                                                 5
                                                               2.41635
                                                                                  -5.
11805
                         0
                                                 4
                                                               2.41635
                                                                                  -5.
11805
                         0
                                                 4
                                                               2.41635
                                                                                  -5.
6
11805
  stddev_roll_dumbbell var_roll_dumbbell avg_pitch_dumbbell stddev_pitch_dumb
bel1
                 17.058
                                     291.001
                                                          13.9312
                                                                                  14.
1062
                 17.058
                                     291.001
                                                                                  14.
                                                          13.9312
1062
                  17.058
                                     291.001
                                                          13.9312
                                                                                  14.
1062
                                     291.001
                                                          13.9312
                 17.058
                                                                                  14.
1062
                  17.058
                                     291.001
                                                          13.9312
                                                                                  14.
5
1062
                                                                                  14.
                 17.058
                                     291.001
                                                          13.9312
6
1062
   var_pitch_dumbbell
                        avg_yaw_dumbbell
                                           stddev_yaw_dumbbell var_yaw_dumbbell
1
             199.0775
                                 64.7063
                                                        13.5747
                                                                          184.5578
2
                                  64.7063
                                                        13.5747
              199.0775
                                                                          184.5578
3
              199.0775
                                  64.7063
                                                        13.5747
                                                                          184.5578
4
              199.0775
                                  64.7063
                                                        13.5747
                                                                          184.5578
5
              199.0775
                                  64.7063
                                                        13.5747
                                                                          184.5578
              199.0775
                                  64.7063
                                                        13.5747
                                                                          184.5578
  gyros_dumbbell_x gyros_dumbbell_y gyros_dumbbell_z accel_dumbbell_x accel_d
umbbell_y
              -0.31
                                  0.16
                                                     0.08
                                                                            5
1
21
              -0.31
                                  0.14
                                                     0.07
                                                                            4
2
22
              -0.31
                                  0.16
                                                     0.05
                                                                            3
3
23
              -0.31
                                  0.16
                                                     0.07
                                                                            5
4
24
                                  0.14
                                                     0.07
                                                                            5
5
              -0.31
23
                                                                            6
              -0.31
                                  0.14
                                                     0.07
6
22
```

```
_ccel_(
_forearm
1
  accel_dumbbell_z magnet_dumbbell_x magnet_dumbbell_y magnet_dumbbell_z roll
                                                         191
                  37
                                    -471
                                                                              277
-111
                  35
                                    -472
                                                         184
                                                                              281
2
-112
                  37
                                    -468
                                                         190
                                                                              275
3
-114
4
                  38
                                    -469
                                                         184
                                                                              285
-115
                  37
                                    -468
                                                         189
                                                                              292
-117
                  36
                                    -473
                                                         188
                                                                              278
6
-118
  pitch_forearm yaw_forearm kurtosis_roll_forearm kurtosis_picth_forearm
                                                                        -0.97525
            26.5
                           138
                                              -1.09475
                           138
2
            26.2
                                              -1.09475
                                                                        -0.97525
3
            26.0
                           137
                                              -1.09475
                                                                        -0.97525
4
                           137
                                                                        -0.97525
             25.8
                                              -1.09475
5
            25.5
                           137
                                              -1.09475
                                                                        -0.97525
6
                           137
                                              -1.09475
                                                                        -0.97525
            25.1
  skewness_roll_forearm skewness_pitch_forearm max_roll_forearm max_picth_for
earm
                 -0.05065
                                            0.17285
                                                                  49.6
1
168
2
                 -0.05065
                                            0.17285
                                                                  49.6
168
                 -0.05065
                                            0.17285
                                                                  49.6
3
168
                 -0.05065
                                                                  49.6
                                            0.17285
4
168
                 -0.05065
                                            0.17285
                                                                  49.6
5
168
                 -0.05065
                                            0.17285
                                                                  49.6
6
168
  max_yaw_forearm min_roll_forearm min_pitch_forearm min_yaw_forearm
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
1
2
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
3
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
4
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
5
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
6
               -1.1
                                  4.65
                                                    -168.5
                                                                        -1.1
    amplitude_roll_forearm amplitude_pitch_forearm amplitude_yaw_forearm
                                                 341.5
1
                       32.2
                                                                              0
2
                       32.2
                                                 341.5
                                                                              0
3
                       32.2
                                                 341.5
                                                                              0
4
                                                                              0
                       32.2
5
                       32.2
                                                 341.5
                                                                              0
6
                                                 341.5
                                                                              0
                       32.2
                         var_accel_forearm
   total_accel_forearm
                                              avg_roll_forearm
                                                                 stddev_roll_forearm
1
                      30
                                    14.0772
                                                       27.85936
                                                                             45.16342
2
                                    14.0772
                      31
                                                      27.85936
                                                                             45.16342
3
                     32
                                    14.0772
                                                      27.85936
                                                                             45.16342
4
                     33
                                    14.0772
                                                      27.85936
                                                                             45.16342
5
                     34
                                    14.0772
                                                      27.85936
                                                                             45.16342
                     36
                                    14.0772
                                                      27.85936
  var_roll_forearm avg_pitch_forearm stddev_pitch_forearm var_pitch_forearm
```

```
79.33451
                                                     8.906695
1
          2749.163
                              25.35597
2
          2749.163
                                                                         79.33451
                              25.35597
                                                     8.906695
3
           2749.163
                              25.35597
                                                     8.906695
                                                                         79.33451
4
           2749.163
                              25.35597
                                                     8.906695
                                                                         79.33451
5
                              25.35597
                                                     8.906695
           2749.163
                                                                         79.33451
                              25.35597
6
          2749.163
                                                     8.906695
                                                                         79.33451
  avg_yaw_forearm stddev_yaw_forearm var_yaw_forearm gyros_forearm_x gyros_fo
rearm_y
         17.09505
                               74.27584
                                                5541.956
                                                                     -0.05
-0.37
2
         17.09505
                               74.27584
                                                5541.956
                                                                     -0.06
-0.37
         17.09505
                               74.27584
                                               5541.956
                                                                     -0.05
3
-0.27
         17.09505
                               74.27584
                                               5541.956
                                                                     0.02
4
-0.24
         17.09505
                               74.27584
                                               5541.956
                                                                     0.08
-0.27
         17.09505
                               74.27584
                                                5541.956
                                                                     0.14
-0.29
  gyros_forearm_z accel_forearm_x accel_forearm_y accel_forearm_z magnet_fore
arm_x
             -0.43
                               -170
                                                  155
                                                                   184
-1160
             -0.59
                               -178
                                                  164
                                                                   182
-1150
             -0.72
                               -182
                                                  172
                                                                   185
-1130
             -0.79
                               -185
                                                  182
                                                                   188
4
-1120
5
             -0.82
                               -188
                                                  195
                                                                   188
-1100
                               -208
                                                  207
                                                                   190
6
             -0.82
-1090
                     magnet_forearm_z accel_forearm_y.1 accel_forearm_z.1
  magnet_forearm_y
               1400
                                  -876
                                                                          184
                                                      155
2
               1410
                                  -871
                                                      164
                                                                          182
3
                                  -863
               1400
                                                      172
                                                                          185
4
               1400
                                  -855
                                                      182
                                                                          188
5
               1400
                                  -843
                                                      195
                                                                          188
6
               1400
                                  -838
                                                      207
                                                                          190
  magnet_forearm_x.1 magnet_forearm_y.1 magnet_forearm_z.1 classe
1
                -1160
                                                           -876
                                                                     Ε
2
                                      1410
                                                          -871
                -1150
                                                                     Ε
3
                                      1400
                                                          -863
                -1130
                                                                     Ε
4
                                                          -855
                                      1400
                                                                     Ε
                -1120
5
                                      1400
                -1100
                                                          -843
                                                                     Ε
6
                -1090
                                      1400
                                                          -838
                                                                     Ε
 head(dataTest)
     user_name raw_timestamp_part_1 raw_timestamp_part_2 cvtd_timestamp new_
window
4005
                           1323095020
                                                      504350 5/12/2011 14:23
         pedro
no
4006
         pedro
                           1323095020
                                                      504423 5/12/2011 14:23
no
                                                      504460 5/12/2011 14:23
4007
         pedro
                           1323095020
no
```

| 4008                 | pedro       |                  | 1323095020         |                     | 532277 5/12/201     | 1 14:23         |
|----------------------|-------------|------------------|--------------------|---------------------|---------------------|-----------------|
| no<br>4009           | pedro       |                  | 1323095020         |                     | 532302 5/12/201     | 1 14:23         |
| no<br>4010           | pedro       |                  | 1323095020         |                     | 572363 5/12/201     | 1 14:23         |
| no<br>belt           | num_window  | roll_belt        | pitch_belt         | yaw_belt            | total_accel_belt ku | rtosis_roll_    |
| 4005                 | 91          | 122              | 25.9               | -3.54               | 19                  | -1.0            |
| 3566<br>4006<br>3566 | 91          | 122              | 25.9               | -3.48               | 19                  | -1.0            |
| 4007<br>3566         | 91          | 122              | 25.8               | -3.39               | 19                  | -1.0            |
| 4008<br>3566         | 91          | 122              | 25.8               | -3.33               | 19                  | -1.0            |
| 4009<br>3566         | 91          | 122              | 25.8               | -3.30               | 19                  | -1.0            |
| 4010<br>3566         | 91          | 122              | 25.8               | -3.29               | 19                  | -1.0            |
| 5500<br>t            | kurtosis_pi | icth_belt s      | skewness_rol       | ll_belt sk          | ewness_roll_belt.1  | max_roll_bel    |
| 4005<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4006<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4007<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4008<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4009<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4010<br>1            |             | -0.39133         | 0.                 | .005406             | 0.045115            | -4.             |
| 4005                 | max_picth_l | belt max_y<br>20 | aw_belt min_<br>-1 | roll_belt_<br>7.25_ | min_pitch_belt min  | _yaw_belt<br>-1 |
| 4003                 |             | 20               | -1<br>-1           | -7.25<br>-7.25      |                     | -1              |
| 4007                 |             | 20               | -1                 | -7.25               |                     | -1              |
| 4008                 |             | 20               | - <u>1</u>         | -7.25               |                     | -1<br>-1        |
| 4009<br>4010         |             | 20<br>20         | -1<br>-1           | -7.25<br>-7.25      |                     | -1<br>-1        |
|                      |             |                  | _                  |                     | amplitude_yaw_belt  |                 |
| ce1_k<br>4005        | летс        | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>4006          |             | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>4007          |             | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>4008          |             | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>4009          |             | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>4010          |             | 1.345            |                    | 2                   | 0                   |                 |
| 0.3<br>_belt         |             | elt stddev       | _roll_belt \       | /ar_roll_b          | elt avg_pitch_belt  | stddev_pitch    |
|                      |             |                  |                    |                     |                     |                 |

```
4005
              121.9
                                   0.6
                                                 0.35
                                                                25.75
0.35
4006
              121.9
                                   0.6
                                                 0.35
                                                                25.75
0.35
4007
                                   0.6
                                                 0.35
              121.9
                                                                25.75
0.35
4008
              121.9
                                   0.6
                                                 0.35
                                                                25.75
0.35
4009
                                   0.6
              121.9
                                                 0.35
                                                                25.75
0.35
                                   0.6
4010
              121.9
                                                 0.35
                                                                25.75
0.35
     var_pitch_belt avg_yaw_belt stddev_yaw_belt var_yaw_belt gyros_belt_x
                             -4.95
4005
                                                                           -0.39
                 0.1
                                                 0.4
                                                              0.17
4006
                             -4.95
                 0.1
                                                 0.4
                                                              0.17
                                                                           -0.39
4007
                             -4.95
                 0.1
                                                 0.4
                                                              0.17
                                                                           -0.37
                                                              0.17
4008
                 0.1
                             -4.95
                                                 0.4
                                                                           -0.39
4009
                 0.1
                             -4.95
                                                 0.4
                                                              0.17
                                                                           -0.39
                 0.1
                             -4.95
                                                 0.4
                                                              0.17
4010
                                                                           -0.40
     gyros_belt_y gyros_belt_z accel_belt_x accel_belt_y accel_belt_z magnet_
belt_x
4005
             -0.03
                           -0.48
                                           -39
                                                           71
                                                                       -170
-1
4006
             -0.03
                           -0.46
                                           -39
                                                           69
                                                                       -172
1
4007
             -0.03
                           -0.46
                                           -40
                                                           68
                                                                       -170
-4
4008
             -0.03
                           -0.46
                                           -42
                                                           69
                                                                       -167
-6
4009
                           -0.46
                                           -42
                                                           70
             -0.03
                                                                       -168
-6
                                            -42
                                                           72
4010
             -0.03
                           -0.46
                                                                       -171
-4
     magnet_belt_y magnet_belt_z roll_arm pitch_arm yaw_arm total_accel_arm
                              -356
4005
                                                   23.1
                                                            47.1
                582
                                        83.0
                                                                                23
4006
                587
                                                            44.5
                                                                                25
                              -358
                                        81.6
                                                   22.1
4007
                              -362
                                                   21.0
                                                            41.9
                                                                                24
                586
                                        80.2
4008
                              -366
                                                   20.0
                                                            39.4
                                                                                26
                589
                                        78.9
4009
                590
                              -368
                                        77.6
                                                   18.9
                                                            36.7
                                                                                27
4010
                591
                              -354
                                        76.5
                                                   17.7
                                                            34.0
                                                                                28
     var_accel_arm avg_roll_arm stddev_roll_arm var_roll_arm avg_pitch_arm
                                                        259.3599
            65.0977
                         76.22175
                                           16.1039
4005
                                                                        -10.1695
                         76.22175
4006
                                           16.1039
                                                         259.3599
            65.0977
                                                                        -10.1695
                                                         259.3599
4007
            65.0977
                         76.22175
                                           16.1039
                                                                        -10.1695
4008
            65.0977
                         76.22175
                                           16.1039
                                                         259.3599
                                                                        -10.1695
            65.0977
4009
                         76.22175
                                           16.1039
                                                         259.3599
                                                                        -10.1695
                                            16.1039
4010
            65.0977
                         76.22175
                                                         259.3599
                                                                        -10.1695
     stddev_pitch_arm var_pitch_arm avg_yaw_arm stddev_yaw_arm var_yaw_arm gy
ros_arm_x
4005
              10.66725
                             113.7978
                                           19.0615
                                                            35.8809
                                                                        1287.463
-2.06
4006
              10.66725
                                                            35.8809
                             113.7978
                                           19.0615
                                                                        1287.463
-2.06
4007
                                                            35.8809
                                                                        1287.463
              10.66725
                             113.7978
                                           19.0615
-2.07
4008
              10.66725
                             113.7978
                                           19.0615
                                                            35.8809
                                                                        1287.463
-2.14
```

| 4009          | 10.66725        | 113.797      | 8 19.06      | 15 35          | .8809 1287.     | 463     |
|---------------|-----------------|--------------|--------------|----------------|-----------------|---------|
| -2.14<br>4010 | 10.66725        | 113.797      | 8 19.06      | 15 35          | .8809 1287.     | 463     |
| -2.12         |                 | 1            |              |                |                 |         |
|               |                 |              |              |                | l_arm_z magnet  |         |
| 4005          | 0.55            | -0.26        | 182          | 28             | 138             | 342     |
| 4006          | 0.56            | -0.31        | 196          | 23             | 148             | 370     |
| 4007          | 0.51            | -0.33        | 193          | 18             | 140             | 388     |
| 4008          | 0.48            | -0.31        | 207          | 21             | 140             | 432     |
| 4009          | 0.43            | -0.28        | 226          | 12             | 140             | 448     |
| 4010          | 0.37            | -0.20        | 235          | . 9            | 143             | 482     |
| _             | et_arm_y magn   | et_arm_z kur | tosis_roll_  | arm kurtosis   | _picth_arm kur  | tosis_  |
| yaw_arm       |                 |              |              |                |                 |         |
| 4005          | 280             | 503          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       |                 |              |              |                |                 |         |
| 4006          | 263             | 485          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       |                 |              |              |                |                 |         |
| 4007          | 261             | 486          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       |                 |              |              |                |                 |         |
| 4008          | 249             | 472          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       | -               |              |              |                |                 |         |
| 4009          | 239             | 454          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       |                 |              |              |                | 0.000==         |         |
| 4010          | 225             | 437          | -1.18        | 224            | -0.96912        | _       |
| 0.86977       | 223             | .5.          | 1110.        |                | 0.50512         |         |
|               | ess roll arm    | skewness ni  | tch arm skev | wness vaw ari  | m max_roll_arm  | ı may n |
| icth_arm      | 1C33_1 0 1 1_a1 | skewiiess_pi | cen_arm ske  | wiic55_yaw_aii | " ""ax_1011_a1" | · max_p |
| 4005          | 0.12353         |              | 0.10319      | 0.05976        | 5 8.45          |         |
| 77.25         | 0.12333         |              | 0.10313      | 0.03370        | 0.4.            | ,       |
| 4006          | 0.12353         |              | 0.10319      | 0.05976        | 5 8.45          | -       |
| 77.25         | 0.12333         |              | 0.10319      | 0.03976        | 0.43            | )       |
| 4007          | 0 12252         |              | 0.10319      | 0.05976        | 5 8.45          | -       |
|               | 0.12353         | -            | 0.10319      | 0.03976        | 0.43            | )       |
| 77.25         | 0 12252         |              | 0 10210      | 0 05076        | г 0.4г          |         |
| 4008          | 0.12353         | -1           | 0.10319      | 0.05976        | 5 8.45          | )       |
| 77.25         | 0 12252         |              | 0 10210      | 0 05076        | г 0.4г          |         |
| 4009          | 0.12353         | -1           | 0.10319      | 0.05976        | 5 8.45          | )       |
| 77.25         | 0 12252         |              | 0 10310      | 0.05076        | . 0 45          |         |
| 4010          | 0.12353         | -1           | 0.10319      | 0.05976        | 5 8.45          | )       |
| 77.25         |                 |              |              |                | 21. 1 22        |         |
|               |                 |              | pitcn_arm m  |                | mplitude_roll_  |         |
| 4005          | 38              | -33.6        | -58.6        | 10             |                 | 945     |
| 4006          | 38              | -33.6        | -58.6        | 10             |                 | 945     |
| 4007          | 38              | -33.6        | -58.6        | 10             |                 | 945     |
| 4008          | 38              | -33.6        | -58.6        | 10             |                 | 945     |
| 4009          | 38              | -33.6        | -58.6        | 10             |                 | 945     |
| 4010          | . 38            | -33.6        | -58.6        |                |                 | 945     |
|               | tude_pitch_a    | rm amplitude | _yaw_arm ro  | _dumbbe        | pitch_dumbbell  | yaw_d   |
| umbbell       |                 | _            |              |                |                 | _       |
| 4005          | 121             | . 5          | 27           | -64.335693     | 34.112879       | 8       |
| 1.36272       |                 |              |              |                |                 |         |
| 4006          | 121             | . 5          | 27           | -40.195925     | 53.186300       | 8       |
| 7.56417       |                 |              |              |                |                 |         |
| 4007          | 121             | . 5          | 27           | -2.792178      | 62.646067       | ' 9     |
| 4.35153       |                 |              |              |                |                 |         |
| 4008          | 121             | . 5          | 27           | 10.384733      | 49.182165       | 10      |
| 6.61750       |                 |              |              |                |                 |         |
|               |                 |              |              |                |                 |         |

| 4009<br>9.09792     | 121.           | 5        | 2           | 27     | 16.647582      | 22.27     | '8218 1          | L2 |
|---------------------|----------------|----------|-------------|--------|----------------|-----------|------------------|----|
| 4010                | 121.           | 5        | 2           | 27     | -14.860425     | 6.17      | 2999 1           | L4 |
| 0.97044<br>kurtosis | roll dumbl     | bell kur | tosis pict  | h dum  | bbell skewnes  | s roll d  | lumbbell         |    |
| 4005                | -0.09          | 9595     | _p.c.       | -0     | .4422          | . <u></u> | 0.0819           |    |
| 4006                | -0.09          |          |             |        | .4422          |           | 0.0819           |    |
| 4007                | -0.09          |          |             |        | .4422          |           | 0.0819           |    |
| 4008<br>4009        | -0.09<br>-0.09 |          |             |        | .4422<br>.4422 |           | 0.0819<br>0.0819 |    |
| 4010                | -0.09          |          |             |        | .4422          |           | 0.0819           |    |
|                     | oitch_dumbl    |          | ax_roll_dum |        | max_picth_du   | ımbbell m |                  | ım |
| bbell               |                |          |             |        |                |           |                  |    |
| 4005                | -(             | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1                |                | 0 016    |             | 44 05  |                | 422       |                  |    |
| 4006                | -(             | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1<br>4007        | ,              | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1                | -(             | 0.210    |             | 41.03  |                | 133       |                  |    |
| 4008                | _(             | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1                | `              | 0.210    |             | 71.03  |                | 133       |                  |    |
| 4009                | -(             | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1                |                |          |             |        |                |           |                  |    |
| 4010                | -(             | 0.216    |             | 41.85  |                | 133       |                  |    |
| -0.1                |                |          |             | _      |                |           |                  |    |
|                     | dumbbell r     | min_pitc | h_dumbbell  | min_   | yaw_dumbbell   | amplitu   | de_roll_du       | ım |
| bbell               | 26 75          |          | 20. 7       | ,      | 0.1            |           |                  |    |
| 4005<br>55.71       | -26.75         |          | 20.2        | -      | -0.1           |           |                  |    |
| 4006                | -26.75         |          | 20.2        | )      | -0.1           |           |                  |    |
| 55.71               | 20.73          |          | 20.2        |        | 0.1            |           |                  |    |
| 4007                | -26.75         |          | 20.2        | !      | -0.1           |           |                  |    |
| 55.71               |                |          |             |        | -              |           |                  |    |
| 4008                | -26.75         |          | 20.2        | )      | -0.1           |           |                  |    |
| 55.71               |                |          |             |        |                |           |                  |    |
| 4009                | -26.75         |          | 20.2        | )<br>- | -0.1           |           |                  |    |
| 55.71               | 26.75          |          | 20. 2       |        | 0.1            |           |                  |    |
| 4010<br>55.71       | -26.75         |          | 20.2        |        | -0.1           |           |                  |    |
|                     | nitch dur      | nbbell a | mnlitude v  | aw du  | mbbell total_  | accel du  | mbbell           |    |
| 4005                | _preen_aai     | 54.74    | шрттешис_у  | aw_au  | 0              | acce i_aa | 9                |    |
| 4006                |                | 54.74    |             |        | Ö              |           | 7                |    |
| 4007                |                | 54.74    |             |        | 0              |           | 7                |    |
| 4008                |                | 54.74    |             |        | 0              |           | 9                |    |
| 4009                |                | 54.74    |             |        | 0              |           | 9                |    |
| 4010                |                | 54.74    |             |        | 0              |           | 8                |    |
| var_accel<br>ell    | _dumbbell      | avg_rol  | I_dumbbelI  | stdd   | ev_roll_dumbb  | ell var_  | roll_dumb        | b  |
| 4005                | 2.41635        |          | -5.11805    |        | 17             | 058       | 291              |    |
| 001                 | Z.41033        |          | J. TT003    |        | 17.            | 000       | 231              |    |
| 4006                | 2.41635        |          | -5.11805    |        | 17.            | 058       | 291              | L. |
| 001                 |                |          |             |        |                |           | _ <b></b>        |    |
| 4007                | 2.41635        |          | -5.11805    |        | 17.            | 058       | 291              | L. |
| 001                 |                |          |             |        |                |           |                  |    |
| 4008                | 2.41635        |          | -5.11805    |        | 17.            | 058       | 291              | L. |
| 001                 |                |          |             |        |                |           |                  |    |

| 4009   | 2.41635  | -5.11805  | 17.058   | 291.   |
|--|--|---|--|--|
| 001<br>4010<br>001   | 2.41635  | -5.11805  | 17.058   | 291.   |
| a  | vg_pitch_dumbbell  | stddev_pitch_dumbbell   | var_pitch_dumbbell   | avg_yaw_dumb   |
| bell<br>4005<br>7063   | 13.9312  | 14.1062   | 199.0775   | 64.  |
| 4006<br>7063   | 13.9312  | 14.1062   | 199.0775   | 64.  |
| 4007   | 13.9312  | 14.1062   | 199.0775   | 64.  |
| 7063<br>4008<br>7063   | 13.9312  | 14.1062   | 199.0775   | 64.  |
| 4009<br>7063   | 13.9312  | 14.1062   | 199.0775   | 64.  |
| 4010<br>7063   | 13.9312  | 14.1062   | 199.0775   | 64.  |
|  | tddev vaw dumbbell   | var_yaw_dumbbell gyro   | os dumbbell x avros  | dumbbell v   |
| 4005   | 13.5747  | 184.5578  | 0.16   | -0.75  |
| 4006   | 13.5747  | 184.5578  | 0.08   | -0.79  |
| 4007   | 13.5747  | 184.5578  | 0.03   | -0.87  |
| 4008   | 13.5747  | 184.5578  | -0.02  | -0.92  |
| 4009   | 13.5747  | 184.5578  | -0.02  | -0.85  |
| 4010   | 13.5747  | 184.5578  | 0.00   | -0.63  |
|  |  | cel_dumbbell_x accel_d  |  |  |
|  |  |   |  |  |
| 4005   | 0.39   | 29  | -52  | 63   |
| 4006   | 0.15   | 35  | -27  | 53   |
| 4007   | -0.02  | 42  | -2   | 58   |
| 4008   | 0.11   | 41  | 9  | 76   |
|  | V. ±±  | · <del>-</del>  |  | , 0  |
|  |  |   |  |  |
| 4009   | 0.33   | 20  | 15   | 87   |
| 4009<br>4010   | 0.33<br>0.51   | 20<br>5   | 15<br>-12  | 87<br>80   |
| 4009<br>4010<br>m  | 0.33<br>0.51<br>agnet_dumbbell_x m   | 20  | 15<br>-12  | 87<br>80   |
| 4009<br>4010<br>m<br>_forea  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm   | 20<br>5<br>agnet_dumbbell_y magne   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup>  | 87<br>80<br>forearm pitch  |
| 4009<br>4010<br>m<br>_forea<br>4005  | 0.33<br>0.51<br>agnet_dumbbell_x m   | 20<br>5   | 15<br>-12  | 87<br>80   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494   | 20<br>5<br>agnet_dumbbell_y magne<br>-550   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup><br>-105  | 87<br>80<br>forearm pitch<br>141   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm   | 20<br>5<br>agnet_dumbbell_y magne   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup>  | 87<br>80<br>forearm pitch  |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494<br>501  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup><br>-105<br>-91   | 87<br>80<br>forearm pitch<br>141<br>142  |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494   | 20<br>5<br>agnet_dumbbell_y magne<br>-550   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup><br>-105  | 87<br>80<br>forearm pitch<br>141   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104   | 87<br>80<br>forearm pitch<br>141<br>142<br>142   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494<br>501  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554   | 15<br>-12<br>et_dumbbell_z roll_ <sup>.</sup><br>-105<br>-91   | 87<br>80<br>forearm pitch<br>141<br>142  |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501<br>514   | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533   | 15<br>-12<br>et_dumbbell_z roll_<br>-105<br>-91<br>-104<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104   | 87<br>80<br>forearm pitch<br>141<br>142<br>142   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501<br>514<br>515  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104<br>-108<br>-98  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141                                       |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501<br>514   | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533   | 15<br>-12<br>et_dumbbell_z roll_<br>-105<br>-91<br>-104<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142   |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494<br>501<br>514<br>515<br>526<br>537  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141                                       |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>.rm<br>494<br>501<br>514<br>515<br>526<br>537  | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141                                       |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi                             | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos                          | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141                                       |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0  | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi                       | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517   | 15<br>-12<br>et_dumbbell_z roll_:<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141                                       |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y   | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi                             | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos                          | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>kewness_roll_f              |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005   | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi                             | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos                          | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108  | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>kewness_roll_f              |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005<br>.05065                                     | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi<br>147<br>143               | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos                          | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108<br>is_picth_forearm sk                         | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>(cewness_roll_f             |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005<br>.05065<br>4006<br>.05065                   | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi<br>147<br>143               | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos-<br>-1.09475<br>-1.09475 | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108<br>is_picth_forearm sk<br>-0.97525<br>-0.97525 | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>(cewness_roll_f<br>-0<br>-0 |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005<br>.05065<br>4006<br>.05065<br>4007           | 0.33<br>0.51<br>agnet_dumbbell_x m<br>rm 494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi<br>147<br>143            | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos                          | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108<br>is_picth_forearm sk                         | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>(cewness_roll_f             |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005<br>.05065<br>4006<br>.05065<br>4007<br>.05065 | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi<br>147<br>143<br>137        | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos<br>-1.09475<br>-1.09475  | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108<br>is_picth_forearm sk<br>-0.97525<br>-0.97525 | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>(sewness_roll_f<br>-0<br>-0 |
| 4009<br>4010<br>m<br>_forea<br>4005<br>40.9<br>4006<br>38.1<br>4007<br>34.3<br>4008<br>31.4<br>4009<br>29.2<br>4010<br>27.0<br>y<br>orearm<br>4005<br>.05065<br>4006<br>.05065<br>4007           | 0.33<br>0.51<br>agnet_dumbbell_x m<br>494<br>501<br>514<br>515<br>526<br>537<br>aw_forearm kurtosi<br>147<br>143<br>137<br>132 | 20<br>5<br>agnet_dumbbell_y magne<br>-550<br>-554<br>-539<br>-533<br>-525<br>-517<br>s_roll_forearm kurtos-<br>-1.09475<br>-1.09475 | 15<br>-12<br>et_dumbbell_z roll_d<br>-105<br>-91<br>-104<br>-108<br>-98<br>-108<br>is_picth_forearm sk<br>-0.97525<br>-0.97525 | 87<br>80<br>forearm pitch<br>141<br>142<br>142<br>142<br>141<br>141<br>(cewness_roll_f<br>-0<br>-0 |

| 4009                     | 128                         | -1.09475             | -0.97525             | -0                   |
|--------------------------|-----------------------------|----------------------|----------------------|----------------------|
| .05065<br>4010<br>.05065 | 123                         | -1.09475             | -0.97525             | -0                   |
|                          | ,<br>skewness_pitch_forearm | max_roll_forearm     | max_picth_forearm    | max_yaw_forear       |
| m<br>4005<br>1           | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 4006<br>1                | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 4007                     | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 1<br>4008<br>1           | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 4009                     | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 1<br>4010                | 0.17285                     | 49.6                 | 168                  | -1.                  |
| 1<br>n                   | min_roll_forearm min_p      | itch_forearm min_y   | /aw_forearm amplitu  | ude_roll_forear      |
| m<br>4005                | 4.65                        | -168.5               | -1.1                 | 32.                  |
| 2<br>4006                | 4.65                        | -168.5               | -1.1                 | 32.                  |
| 2<br>4007<br>2           | 4.65                        | -168.5               | -1.1                 | 32.                  |
| 4008<br>2                | 4.65                        | -168.5               | -1.1                 | 32.                  |
| 4009<br>2                | 4.65                        | -168.5               | -1.1                 | 32.                  |
| 4010<br>2                | 4.65                        | -168.5               | -1.1                 | 32.                  |
| ā                        | amplitude_pitch_forear      |                      |                      |                      |
| 4005<br>4006             | 341.<br>341.                |                      | 0<br>0               | 29<br>40             |
| 4007                     | 341.                        | _                    | 0                    | 39                   |
| 4008                     | 341.                        | 5                    | 0                    | 39                   |
| 4009                     | 341.                        | 5                    | 0                    | 39                   |
| 4010                     | 341.                        |                      | 0                    | 38                   |
|                          | var_accel_forearm avg_      |                      |                      |                      |
| 4005<br>4006             | 14.0772<br>14.0772          | 27.85936<br>27.85936 | 45.16342<br>45.16342 | 2749.163<br>2749.163 |
| 4007                     | 14.0772                     | 27.85936             | 45.16342             | 2749.163             |
| 4007                     | 14.0772                     | 27.85936             | 45.16342             | 2749.163             |
| 4009                     | 14.0772                     | 27.85936             | 45.16342             | 2749.163             |
| 4010                     | 14.0772                     | 27.85936             | 45.16342             | 2749.163             |
|                          | avg_pitch_forearm stdd      |                      |                      |                      |
| 4005                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
| 4006                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
| 4007                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
| 4008                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
| 4009                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
| 4010                     | 25.35597                    | 8.906695             | 79.33451             | 17.09505             |
|                          | stddev_yaw_forearm var      |                      | s_forearm_x gyros_1  | forearm_y            |
| 4005                     | 74.27584                    | 5541.956             | 0.16                 | 3.48                 |
| 4006                     | 74.27584                    | 5541.956             | 0.11                 | 3.36                 |
| 4007                     | 74.27584                    | 5541.956             | 0.21                 | 4.38                 |
|                          |                             |                      |                      |                      |

```
4008
                74.27584
                                 5541.956
                                                       0.02
                                                                         3.77
4009
                74.27584
                                 5541.956
                                                      -0.35
                                                                         3.21
                                 5541.956
                74.27584
4010
                                                      -0.69
                                                                         3.58
     gyros_forearm_z accel_forearm_x accel_forearm_y accel_forearm_z magnet_f
orearm_x
                 3.08
4005
                                    12
                                                     269
                                                                      -98
-704
                 2.76
4006
                                   -51
                                                     353
                                                                     -158
-706
4007
                 2.03
                                    33
                                                     357
                                                                     -122
-700
                                     9
4008
                 1.74
                                                     359
                                                                     -125
-684
4009
                                     -9
                 1.44
                                                     352
                                                                     -143
-673
4010
                 1.07
                                    -44
                                                     335
                                                                     -153
-652
     magnet_forearm_y magnet_forearm_z accel_forearm_y.1 accel_forearm_z.1
4005
                   398
                                      921
                                                         269
4006
                   484
                                      923
                                                         353
                                                                            -158
4007
                   524
                                      921
                                                         357
                                                                            -122
4008
                   589
                                      923
                                                         359
                                                                            -125
4009
                   619
                                      935
                                                         352
                                                                            -143
4010
                                      947
                                                         335
                   672
                                                                            -153
     magnet_forearm_x.1 magnet_forearm_y.1 magnet_forearm_z.1 classe
4005
                                          398
                    -704
                                                               921
                                                                        C
4006
                    -706
                                          484
                                                               923
                                                                        C
4007
                    -700
                                          524
                                                               921
                                                                        C
4008
                                                                        C
                    -684
                                                               923
                                          589
                                                                        C
4009
                    -673
                                          619
                                                               935
4010
                    -652
                                          672
                                                               947
                                                                        C
> indexNA <- as.vector(sapply(dataTrain[,1:158],function(x) {length(which(is.</pre>
na(x)))!=0}))
> dataTrain <- dataTrain[,!indexNA]</pre>
> train_control<- trainControl(method="cv", number=10)</pre>
> model<- train(classe ~., data=dataTrain,trControl=train_control, method="rf</pre>
")
> model
Random Forest
4004 samples
157 predictor
   5 classes: 'A', 'B', 'C', 'D', 'E'
No pre-processing
Resampling: Cross-Validated (10 fold)
Summary of sample sizes: 3604, 3604, 3604, 3604, 3603, 3603, ...
Resampling results across tuning parameters:
  mtry
        Accuracy
                    Карра
        0.9730274
                    0.9617679
    2
   83
        1.0000000
                    1.0000000
        0.9990006
                    0.9985890
  165
```

```
Accuracy was used to select the optimal model using the largest value.
The final value used for the model was mtry = 83.
> # make predictions
> predictions<- predict(model,dataTrain)</pre>
> # append predictions
> pred<- cbind(dataTrain,predictions)</pre>
> # summarize results
> confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)</pre>
> confusionMatrix
Confusion Matrix and Statistics
          Reference
Prediction
               Α
                    В
                         C
                               D
                                    Ε
         A 1365
                         0
                    0
                               0
                                    0
                  901
                                    0
                         0
                               0
         C
               0
                    0
                        92
                               0
                                    0
         D
               0
                    0
                         0
                             276
                                    0
         Ε
               0
                    0
                         0
                               0 1370
Overall Statistics
                Accuracy: 1
                  95% CI: (0.9991, 1)
    No Information Rate: 0.3422
    P-Value [Acc > NIR] : < 2.2e-16
                   Kappa: 1
 Mcnemar's Test P-Value: NA
Statistics by Class:
                      Class: A Class: B Class: C Class: D Class: E
                                   1.000 1.00000
Sensitivity
                        1.0000
                                                    1.00000
                                                               1.0000
                        1.0000
                                          1.00000
                                                    1.00000
Specificity
                                   1.000
                                                               1.0000
Pos Pred Value
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                               1.0000
Neg Pred Value
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                               1.0000
Prevalence
                        0.3409
                                   0.225
                                          0.02298
                                                    0.06893
                                                               0.3422
Detection Rate
                        0.3409
                                   0.225
                                          0.02298
                                                    0.06893
                                                               0.3422
Detection Prevalence
                        0.3409
                                   0.225
                                          0.02298
                                                    0.06893
                                                               0.3422
Balanced Accuracy
                        1.0000
                                   1.000 1.00000
                                                    1.00000
                                                               1.0000
> #how do we create a cross validation scheme
> control <- trainControl(method = 'repeatedcv',</pre>
                           number = 10,
+
                            repeats = 3)
> seed <-7
> metric <- 'Accuracy'</pre>
> set.seed(seed)
> mtry <- sqrt(ncol(dataTrain))</pre>
> tunegrid <- expand.grid(.mtry=mtry)</pre>
> rf_default <- train(pitch_belt~.,</pre>
                       data = dataTrain,
                       method = 'rf',
                       metric = 0,
                       tuneGrid = tunegrid,
+
                       trControl = control)
Warning message:
In train.default(x, y, weights = w, ...) :
```

The metric "O" was not in the result set. RMSE will be used instead. > print(rf\_default) Random Forest 4004 samples

157 predictor

No pre-processing

Resampling: Cross-Validated (10 fold, repeated 3 times) Summary of sample sizes: 3602, 3603, 3603, 3603, 3605, 3604, ... Resampling results:

Rsquared MAE 0.3719505 0.9996205 0.1836054

Tuning parameter 'mtry' was held constant at a value of 12.56981

- > #-----
- > # make predictions
- > predictions<- predict(rf\_default,dataTest)</pre>
- > # append predictions
- > pred<- cbind(dataTest,predictions)</pre>
- > # summarize results
- > confusionMatrix<- confusionMatrix(pred\$predictions,pred\$classe)
  Error: `data` and `reference` should be factors with the same levels.</pre>

> confusionMatrix

Confusion Matrix and Statistics

## Reference

| Prediction | Α    | В   | C  | D   | Е    |
|------------|------|-----|----|-----|------|
| Α          | 1365 | 0   | 0  | 0   | 0    |
| В          | 0    | 901 | 0  | 0   | 0    |
| С          | 0    | 0   | 92 | 0   | 0    |
| D          | 0    | 0   | 0  | 276 | 0    |
| F          | 0    | 0   | 0  | 0   | 1370 |

Overall Statistics

Accuracy: 1

95% CI: (0.9991, 1)

No Information Rate: 0.3422 P-Value [Acc > NIR] : < 2.2e-16

Kappa: 1 Mcnemar's Test P-Value: NA

Statistics by Class:

|                      | Class: A | Class: B | Class: C | Class: D | Class: E |
|----------------------|----------|----------|----------|----------|----------|
| Sensitivity          | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Specificity          | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Pos Pred Value       | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Neg Pred Value       | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Prevalence           | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Detection Rate       | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Detection Prevalence | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Balanced Accuracy    | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |

```
> varImp(rf_default)
Error in varImp[, "%IncMSE"] : subscript out of bounds
Called from: data.frame(Overall = varImp[, "%IncMSE"])
Browse[1]> #-----
Browse[1]> # random search for parameters
Browse[1]> control <- trainControl(method = 'repeatedcv',</pre>
                           number = 10.
                           repeats = 3.
+
                           search = 'random')
Browse[1]> # make predictions
Browse[1]> predictions<- predict(rf_default,dataTest)</pre>
Browse[1]>
> # append predictions
> pred<- cbind(dataTest,predictions)</pre>
> # summarize results
> confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)
Error: `data` and `reference` should be factors with the same levels.</pre>
> confusionMatrix
Confusion Matrix and Statistics
          Reference
Prediction
                              D
              Α
                         C
                                    Ε
         A 1365
                    0
                         0
                               0
                                    0
                 901
                         0
                              0
                                    0
         В
               0
                        92
         C
                    0
                              0
                                    0
               0
               0
                    0
                         0 276
                                    0
         Ε
                              0 1370
Overall Statistics
                Accuracy: 1
                  95% CI: (0.9991, 1)
    No Information Rate: 0.3422
    P-Value [Acc > NIR] : < 2.2e-16
                   Kappa: 1
 Mcnemar's Test P-Value: NA
Statistics by Class:
                      Class: A Class: B Class: C Class: D Class: E
                                   1.000
Sensitivity
                         1.0000
                                          1.00000
                                                   1.00000
                                                               1.0000
Specificity
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                               1.0000
                        1.0000
                                   1.000
                                          1.00000
                                                   1.00000
                                                               1.0000
Pos Pred Value
Neg Pred Value
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                               1.0000
Prevalence
                        0.3409
                                   0.225
                                                    0.06893
                                                               0.3422
                                          0.02298
Detection Rate
                        0.3409
                                   0.225
                                           0.02298
                                                               0.3422
                                                    0.06893
Detection Prevalence
                        0.3409
                                   0.225
                                           0.02298
                                                               0.3422
                                                    0.06893
                        1.0000
Balanced Accuracy
                                   1.000
                                           1.00000
                                                    1.00000
                                                               1.0000
> varImp(random)
Error in varImp(random) : object 'random' not found
> #-----
> # Grid search
> control <- trainControl(method = 'repeatedcv',</pre>
                           number = 10,
```

```
repeats = 3,
                           search = 'grid')
> set.seed(seed)
> tunegrid <- expand.grid(.mtry=c(1:80))</pre>
> #mtry <- sqrt(ncol(x))</pre>
> rf_gridsearch <- train(~.,
                          data = dataTrain[1:200.].
                          method = 'rf'
+
                          metric = metric,
+
                          tuneGrid = tunegrid,
                          trControl = control)
Error: Please make sure `y` is a factor or numeric value.
> print(rf_gridsearch)
Error in print(rf_gridsearch) : object 'rf_gridsearch' not found
> plot(rf_gridsearch)
Error in plot(rf_gridsearch) : object 'rf_gridsearch' not found
> # make predictions
> predictions<- predict(rf_gridsearch,dataTest)</pre>
Error in predict(rf_gridsearch, dataTest) :
  object 'rf_gridsearch' not found
> # append predictions
> pred<- cbind(dataTest,predictions)</pre>
> # summarize results
> confusionMatrix<- confusionMatrix(pred$predictions,pred$pitch_belt)</pre>
Error: `data` and `reference` should be factors with the same levels.
> confusionMatrix
Confusion Matrix and Statistics
          Reference
Prediction
              Α
                         C
                              D
                                    Ε
         A 1365
                         0
                    0
                              0
                                    0
                  901
                         0
         В
              0
                              0
                                    0
                        92
                              0
         C
               0
                    0
                                    0
                    0
                         0
         D
               0
                            276
                                    0
                    0
                         0
                              0 1370
         F
              0
Overall Statistics
               Accuracy: 1
                  95% CI: (0.9991, 1)
    No Information Rate: 0.3422
    P-Value [Acc > NIR] : < 2.2e-16
                   Kappa: 1
 Mcnemar's Test P-Value: NA
Statistics by Class:
                      Class: A Class: B Class: C Class: D Class: E
                                   1.000 1.00000 1.00000
                                                              1.0000
                        1.0000
Sensitivity
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                              1.0000
Specificity
Pos Pred Value
                        1.0000
                                   1.000
                                          1.00000
                                                    1.00000
                                                              1.0000
                                   1.000
Neg Pred Value
                        1.0000
                                          1.00000
                                                    1.00000
                                                              1.0000
Prevalence
                        0.3409
                                   0.225
                                          0.02298
                                                    0.06893
                                                              0.3422
                                   0.225
Detection Rate
                        0.3409
                                          0.02298
                                                    0.06893
                                                              0.3422
```

```
Detection Prevalence
                        0.3409
                                  0.225 0.02298 0.06893
                                                              0.3422
Balanced Accuracy
                        1.0000
                                  1.000 1.00000 1.00000
                                                              1.0000
> varImp(rf_gridsearch)
Error in varImp(rf_gridsearch) : object 'rf_gridsearch' not found
 -----
>
+
    # Boosting
   # -----
+ # Boosting model requires three things
+ #1- a loss function to be optimized
+ #2- a weak learner to make predictions
+ #3- an additive model to add the weak learners to minimize the loss functio
+
+ # gradient boosting
+ control <- trainControl(method = 'repeatedcv',</pre>
                           number = 5,
+
                           repeats = 3,
                           search = 'grid')
Error in -`*tmp*` : invalid argument to unary operator
> seed <- 7
> library(C50)
> set.seed(seed)
> metric <- 'Accuracy'</pre>
> gbm_mod <- train(pitch_belt~.,</pre>
                    data = dataTrain,
+
                    method = 'gbm',
+
                    metric = 0.
                    trControl = control)
       TrainDeviance
                        ValidDeviance
Iter
                                         StepSize
                                                     Improve
     1
                                           0.1000
             290.4643
                                                     66.8385
                                   nan
     2
             240.0107
                                   nan
                                           0.1000
                                                     49.7536
                                                     39.9944
     3
             199.7165
                                   nan
                                           0.1000
     4
                                           0.1000
                                                     31.6237
             166.7692
                                   nan
     5
             138.7180
                                   nan
                                           0.1000
                                                     27.8200
     6
             117.1658
                                           0.1000
                                                     21.8218
                                   nan
                                           0.1000
                                                     17.7844
     7
              99.0041
                                   nan
                                           0.1000
     8
              84.2149
                                                     13.7951
                                   nan
     9
              71.1916
                                           0.1000
                                                     12.5779
                                   nan
    10
              60.7509
                                           0.1000
                                                     10.4406
                                   nan
                                                      2.0061
    20
              16.9581
                                           0.1000
                                   nan
               4.0588
    40
                                           0.1000
                                                      0.1219
                                   nan
                                           0.1000
    60
               2.5921
                                                      0.0084
                                   nan
    80
               2.1022
                                           0.1000
                                                     -0.0069
                                   nan
   100
               1.7142
                                           0.1000
                                                     -0.0182
                                   nan
   120
               1.5353
                                           0.1000
                                                     -0.0081
                                   nan
   140
               1.2641
                                           0.1000
                                                      0.0052
                                   nan
   150
               1.2063
                                           0.1000
                                                      0.0001
                                   nan
Warning messages:
1: In train.default(x, y, weights = w, ...) :
  The metric "O" was not in the result set. RMSE will be used instead.
2: In (function (x, y, offset = NULL, misc = NULL, distribution = "bernoulli"
  variable 30: amplitude_yaw_belt has no variation.
```

```
3: In (function (x, y, offset = NULL, misc = NULL, distribution = "bernoulli"
 variable 103: amplitude_yaw_dumbbell has no variation.
4: In (function (x, y, offset = NULL, misc = NULL, distribution = "bernoulli"
  variable 139: amplitude_yaw_forearm has no variation.
> print(abm mod)
Stochastic Gradient Boosting
4004 samples
 157 predictor
No pre-processing
Resampling: Cross-Validated (10 fold, repeated 3 times)
Summary of sample sizes: 3602, 3603, 3603, 3603, 3605, 3604, ...
Resampling results across tuning parameters:
  interaction.depth
                     n.trees
                                        Rsquared
                                                    MAE
                                                    2.0739488
                      50
                              3.870491
                                        0.9708972
  1
                     100
                              2.518277
                                        0.9818947
                                                    1.1065126
  1
                     150
                              2.258849
                                        0.9850289
                                                   0.9958785
  2
                              2.183970
                      50
                                        0.9866430 1.0364026
  2
                     100
                              1.662759
                                        0.9916854
                                                   0.8202113
  2
                     150
                              1.485456
                                        0.9934375
                                                   0.7464795
  3
                      50
                              1.950370
                                        0.9886048
                                                   0.9201246
  3
                     100
                              1.529421
                                        0.9928336
                                                   0.7607945
  3
                              1.330676
                                        0.9946265
                     150
                                                   0.6793264
Tuning parameter 'shrinkage' was held constant at a value of 0.1
Tunina
 parameter 'n.minobsinnode' was held constant at a value of 10
RMSE was used to select the optimal model using the smallest value.
The final values used for the model were n.trees = 150, interaction.depth =
 3, shrinkage = 0.1 and n.minobsinnode = 10.
> plot(qbm_mod)
> summary(gbm_mod)
                                                                    rel.inf
                                                           var
accel_belt_x
                                                  accel_belt_x 5.294894e+01
user_namecarlitos
                                             user_namecarlitos 2.264130e+01
yaw_belt
                                                      yaw_belt 1.009582e+01
                                                 magnet_belt_z 3.195192e+00
magnet_belt_z
                                                     roll_belt 2.097407e+00
roll_belt
                                                 magnet_belt_x 1.915681e+00
magnet_belt_x
                                                 magnet_belt_y 1.262021e+00
magnet_belt_y
user_nameeurico
                                               user_nameeurico 9.356612e-01
                                               accel_forearm_z 8.031061e-01
accel_forearm_z
                                                  yaw_dumbbell 6.542763e-01
yaw_dumbbell
                                             magnet_dumbbell_z 5.525906e-01
magnet_dumbbell_z
roll arm
                                                      roll arm 4.706543e-01
magnet_forearm_y
                                              magnet_forearm_y 4.194178e-01
raw_timestamp_part_1
                                         raw_timestamp_part_1 4.174086e-01
                                              accel_dumbbell_y 3.929518e-01
accel_dumbbell_y
total_accel_belt
                                              total_accel_belt 2.065530e-01
classeE
                                                       classeE 1.635014e-01
                                                  gyros_belt_x 7.771816e-02
gyros_belt_x
                                                  gyros_belt_z 7.088366e-02
gyros_belt_z
```

```
magnet_forearm_z
                                              magnet_forearm_z 6.476310e-02
                                              gyros_dumbbell_z 6.476114e-02
gyros_dumbbell_z
                                             magnet_dumbbell_y 6.082279e-02
magnet_dumbbell_y
accel_arm_y
                                                    accel_arm_y 4.211095e-02
magnet_forearm_x
                                              magnet_forearm_x 3.649721e-02
                                                    gyros_arm_x 3.524758e-02
gyros_arm_x
                                          raw timestamp part 2 3.187452e-02
raw_timestamp_part_2
magnet_arm_y
                                                  magnet_arm_y 2.913115e-02
roll_forearm
                                                  roll_forearm 2.691063e-02
accel_belt_y
                                                  accel_belt_y 2.612166e-02
                                                  gyros_belt_y 2.610858e-02
gyros_belt_y
                                               accel_forearm_x 2.591538e-02
accel_forearm_x
yaw_forearm
                                                   yaw_forearm 2.342590e-02
                                                  magnet_arm_x 2.176473e-02
magnet_arm_x
                                                  roll_dumbbell 1.994693e-02
roll_dumbbell
gyros_dumbbell_y
                                              gyros_dumbbell_y 1.606333e-02
                                              accel_dumbbell_z 1.393099e-02
accel_dumbbell_z
accel_arm_z
                                                    accel_arm_z 1.171088e-02
                                                  pitch_forearm 1.000282e-02
pitch_forearm
magnet_dumbbell_x
                                             magnet_dumbbell_x 9.832274e-03
                                                   gyros_arm_z 9.797342e-03
gyros_arm_z
                                               gyros_forearm_y 8.829820e-03
gyros_forearm_y
                                                        yaw_arm 8.821700e-03
yaw_arm
accel_belt_z
                                                  accel_belt_z 6.208694e-03
cvtd_timestamp5/12/2011 14:22 cvtd_timestamp5/12/2011 14:22 6.063530e-03
                                              accel_dumbbell_x 5.853397e-03
accel_dumbbell_x
accel_arm_x
                                                    accel_arm_x 5.649238e-03
                                          total_accel_dumbbell 4.196944e-03
total_accel_dumbbell
                                               gyros_forearm_z 4.185309e-03
gyros_forearm_z
                                               accel_forearm_y 3.517185e-03
pitch_dumbbell 3.131461e-03
accel_forearm_y
pitch_dumbbell
gyros_forearm_x
                                               gyros_forearm_x 2.607342e-03
                                                    gyros_arm_y 2.402347e-03
gyros_arm_y
                                               total_accel_arm 2.323679e-03
total_accel_arm
total_accel_forearm
                                           total_accel_forearm 1.821801e-03
                                              gyros_dumbbell_x 1.812110e-03
gyros_dumbbell_x
                                                      pitch_arm 1.803214e-03
pitch_arm
min_pitch_forearm
                                             min_pitch_forearm 1.147246e-03
var_yaw_belt
                                                  var_yaw_belt 1.011198e-03
magnet_arm_z
                                                  magnet_arm_z 7.885704e-04
user_namejeremy
                                               user_namejeremy 0.000000e+00
                                                user_namepedro 0.000000e+00
user_namepedro
cvtd_timestamp28/11/2011 14:15 cvtd_timestamp28/11/2011 14:15 0.000000e+00
cvtd_timestamp30/11/2011 17:12 cvtd_timestamp30/11/2011 17:12 0.000000e+00
                                 cvtd_timestamp5/12/2011 11:23 0.000000e+00
cvtd_timestamp5/12/2011 11:23
cvtd_timestamp5/12/2011 11:25
                                 cvtd_timestamp5/12/2011 11:25 0.000000e+00
cvtd_timestamp5/12/2011 14:23 cvtd_timestamp5/12/2011 14:23 0.000000e+00
                                                 new_windowyes 0.000000e+00
new_windowyes
                                                     num_window 0.00000e+00
num_window
kurtosis_roll_belt
                                            kurtosis_roll_belt 0.000000e+00
kurtosis_picth_belt
                                           kurtosis_picth_belt 0.000000e+00
skewness_roll_belt
                                            skewness_roll_belt 0.000000e+00
                                          skewness_roll_belt.1 0.000000e+00
skewness_roll_belt.1
max_roll_belt
                                                 max_roll_belt 0.000000e+00
                                                max_picth_belt 0.000000e+00
max_picth_belt
max_yaw_belt
                                                  max_yaw_belt 0.000000e+00
min_roll_belt
                                                 min_roll_belt 0.000000e+00
```

| min_pitch_belt           | <pre>min_pitch_belt</pre>     | 0.000000e+00  |
|--------------------------|-------------------------------|---------------|
| min_yaw_belt             | min_yaw_belt                  | 0.000000e+00  |
| amplitude_roll_belt      | amplitude_roll_belt           |               |
| amplitude_pitch_belt     | amplitude_pitch_belt          |               |
| amplitude_yaw_belt       | amplitude_yaw_belt            |               |
| var_total_accel_belt     | var_total_accel_belt          |               |
| avg_roll_belt            | avg_roll_belt                 |               |
| stddev_roll_belt         | stddev_roll_belt              |               |
| var_roll_belt            | var_roll_belt                 |               |
|                          | avg_pitch_belt                |               |
| avg_pitch_belt           |                               |               |
| stddev_pitch_belt        | stddev_pitch_belt             |               |
| var_pitch_belt           | var_pitch_belt                |               |
| avg_yaw_belt             |                               | 0.000000e+00  |
| stddev_yaw_belt          | stddev_yaw_belt               |               |
| var_accel_arm            | var_accel_arm                 |               |
| avg_roll_arm             |                               | 0.000000e+00  |
| stddev_roll_arm          | stddev_roll_arm               |               |
| var_roll_arm             | var_roll_arm                  |               |
| avg_pitch_arm            | avg_pitch_arm                 | 0.000000e+00  |
| stddev_pitch_arm         | stddev_pitch_arm              |               |
| var_pitch_arm            | var_pitch_arm                 | 0.000000e+00  |
| avg_yaw_arm              | avg_yaw_arm                   | 0.000000e+00  |
| stddev_yaw_arm           | stddev_yaw_arm                |               |
| var_yaw_arm              |                               | 0.00000e+00   |
| kurtosis_roll_arm        | kurtosis_roll_arm             |               |
| kurtosis_picth_arm       | kurtosis_picth_arm            |               |
| kurtosis_yaw_arm         | kurtosis_yaw_arm              |               |
| skewness_roll_arm        | skewness_roll_arm             |               |
| skewness_pitch_arm       | skewness_pitch_arm            |               |
| skewness_yaw_arm         | skewness_yaw_arm              |               |
| max_roll_arm             | max_roll_arm                  | 0.00000000+00 |
| max_picth_arm            | max_picth_arm                 |               |
| •                        |                               | 0.000000e+00  |
| max_yaw_arm              |                               |               |
| min_roll_arm             | min_roll_arm                  |               |
| min_pitch_arm            | min_pitch_arm                 | 0.0000000e+00 |
| min_yaw_arm              |                               | 0.000000e+00  |
| amplitude_roll_arm       | amplitude_roll_arm            |               |
| amplitude_pitch_arm      | amplitude_pitch_arm           |               |
| amplitude_yaw_arm        | amplitude_yaw_arm             |               |
| kurtosis_roll_dumbbell   | kurtosis_roll_dumbbell        | 0.000000e+00  |
| kurtosis_picth_dumbbell  | kurtosis_picth_dumbbell       | 0.000000e+00  |
| skewness_roll_dumbbell_  | skewness_roll_dumbbell        | 0.000000e+00  |
| skewness_pitch_dumbbell  | skewness_pitch_dumbbell       | 0.000000e+00  |
| max_roll_dumbbell        | max_roll_dumbbell             | 0.000000e+00  |
| max_picth_dumbbell       | max_picth_dumbbell            | 0.000000e+00  |
| max_yaw_dumbbell         | max_yaw_dumbbell              | 0.000000e+00  |
| min_roll_dumbbell        | min_roll_dumbbell             | 0.000000e+00  |
| min_pitch_dumbbell       | <pre>min_pitch_dumbbell</pre> | 0.000000e+00  |
| min_yaw_dumbbell         | min_yaw_dumbbell              | 0.000000e+00  |
| amplitude_roll_dumbbell  | amplitude_roll_dumbbell       | 0.000000e+00  |
| amplitude_pitch_dumbbell | amplitude_pitch_dumbbell      | 0.000000e+00  |
| amplitude_yaw_dumbbell   | amplitude_yaw_dumbbell        | 0.000000e+00  |
| var_accel_dumbbell       | var_accel_dumbbell            | 0.000000e+00  |
| avg_roll_dumbbell        | avg_roll_dumbbell             | 0.000000e+00  |
| stddev_roll_dumbbell     | stddev_roll_dumbbell          | 0.000000e+00  |
| var_roll_dumbbell        | var_roll_dumbbell             |               |
| avg_pitch_dumbbell       | avg_pitch_dumbbell            |               |
| 4.3_p   Cell_44   00e    | avg_preen_dambberr            | 3.0000000100  |

```
stddev_pitch_dumbbell 0.000000e+00
stddev_pitch_dumbbell
                                              var_pitch_dumbbell 0.000000e+00
var_pitch_dumbbell
                                                avg_yaw_dumbbell 0.000000e+00
avg_yaw_dumbbell
stddev_yaw_dumbbell
                                             stddev_yaw_dumbbell 0.000000e+00
var_yaw_dumbbell
                                                var_yaw_dumbbell 0.000000e+00
kurtosis_roll_forearm
                                           kurtosis_roll_forearm 0.000000e+00
kurtosis picth forearm
                                          kurtosis picth forearm 0.000000e+00
skewness roll forearm
                                           skewness roll forearm 0.000000e+00
skewness_pitch_forearm
                                          skewness_pitch_forearm 0.000000e+00
max_roll_forearm
                                                max_roll_forearm 0.000000e+00
                                               max_picth_forearm 0.000000e+00
max_picth_forearm
                                                 max_yaw_forearm 0.000000e+00
max_yaw_forearm
min_roll_forearm
                                                min_roll_forearm 0.000000e+00
                                                 min_yaw_forearm 0.000000e+00
min_yaw_forearm
amplitude_roll_forearm
                                          amplitude_roll_forearm 0.000000e+00
amplitude_pitch_forearm
                                        amplitude_pitch_forearm 0.000000e+00
amplitude_yaw_forearm
                                           amplitude_yaw_forearm 0.000000e+00
                                               var_accel_forearm 0.000000e+00
var_accel_forearm
avg_roll_forearm
                                                avg_roll_forearm 0.000000e+00
                                             stddev_roll_forearm 0.000000e+00
stddev_roll_forearm
var_roll_forearm
                                                var_roll_forearm 0.000000e+00
                                               avg_pitch_forearm 0.000000e+00
avg_pitch_forearm
                                            stddev_pitch_forearm 0.000000e+00
stddev_pitch_forearm
var_pitch_forearm
                                               var_pitch_forearm 0.000000e+00
avg_yaw_forearm
                                                 avg_yaw_forearm 0.000000e+00
stddev_yaw_forearm
                                              stddev_yaw_forearm 0.000000e+00
var_yaw_forearm
                                                 var_yaw_forearm 0.000000e+00
accel_forearm_y.1
                                               accel_forearm_y.1 0.000000e+00
accel_forearm_z.1
                                               accel_forearm_z.1 0.000000e+00
                                              magnet_forearm_x.1 0.000000e+00
magnet_forearm_x.1
magnet_forearm_v.1
                                              magnet_forearm_y.1 0.000000e+00
                                              magnet_forearm_z.1 0.000000e+00
magnet_forearm_z.1
                                                          classeB 0.000000e+00
classeB
                                                          classeC 0.000000e+00
classeC
classeD
                                                          classeD 0.000000e+00
> # make predictions
> predictions<- predict(gbm_mod,dataTest)</pre>
> # append predictions
> pred<- cbind(dataTest,predictions)</pre>
> # summarize results
> confusionMatrix<- confusionMatrix(pred$predictions,pred$classe)
Error: `data` and `reference` should be factors with the same levels.</pre>
> confusionMatrix
Confusion Matrix and Statistics
          Reference
Prediction
                         C
                                    Ε
                               D
         A 1365
                         0
                               0
                                    0
                    0
                  901
                         0
                               0
                                    0
         В
               0
         C
               0
                    0
                         92
                               0
                                    0
                    0
                         0
                             276
                                    0
         D
               0
         Ε
               0
                    0
                         0
                               0 1370
```

Overall Statistics

Accuracy : 1

95% CI : (0.9991, 1)

No Information Rate: 0.3422 P-Value [Acc > NIR]: < 2.2e-16

Kappa: 1 Mcnemar's Test P-Value: NA

## Statistics by Class:

|                      | Class: A | Class: B | class: c | Class: D | Class: E |
|----------------------|----------|----------|----------|----------|----------|
| Sensitivity          | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Specificity          | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Pos Pred Value       | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Neg Pred Value       | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |
| Prevalence           | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Detection Rate       | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Detection Prevalence | 0.3409   | 0.225    | 0.02298  | 0.06893  | 0.3422   |
| Balanced Accuracy    | 1.0000   | 1.000    | 1.00000  | 1.00000  | 1.0000   |





