## Predicting the manner and quality of Barbell Lifts using data from Fitness Devices

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```
if(!file.exists("pml-training.csv"))
{
  download.file("https://d396qusza40orc.cloudfront.net/predmachlearn/pml-training.csv", "pml-training.c
}
dataset <- read.csv("pml-training.csv", na.strings = c("NA", ""))</pre>
if(!file.exists("pml-testing.csv"))
  download.file("https://d396qusza40orc.cloudfront.net/predmachlearn/pml-testing.csv", "pml-testing.csv
validation <- read.csv("pml-testing.csv")</pre>
importing files:
library(caret)
## Warning: package 'caret' was built under R version 3.6.3
## Loading required package: lattice
## Loading required package: ggplot2
library(randomForest)
## Warning: package 'randomForest' was built under R version 3.6.3
## randomForest 4.6-14
## Type rfNews() to see new features/changes/bug fixes.
##
## Attaching package: 'randomForest'
## The following object is masked from 'package:ggplot2':
##
       margin
```

## library(ggplot2)

## set.seed(17)

```
inTrain = createDataPartition(y=dataset$classe, p=0.7, list=FALSE)
training_data = dataset[inTrain,]
testing_data = dataset[-inTrain,]
```

elimination of unwanted columns:

```
na = sapply(training_data, function(x) {sum(is.na(x))}) #Make a vector of all the columns and the number
na
```

##	Х	user_name	${\tt raw\_timestamp\_part\_1}$
##	0	0	0
##	${\tt raw\_timestamp\_part\_2}$	$\mathtt{cvtd\_timestamp}$	new_window
##	0	0	0
##	num_window	roll_belt	pitch_belt
##	0	0	0
##	${ t yaw\_belt}$	total_accel_belt	kurtosis_roll_belt
##	0	0	13443
##	kurtosis_picth_belt	kurtosis_yaw_belt	skewness_roll_belt
##	13443	13443	13443
##	skewness_roll_belt.1	${\tt skewness\_yaw\_belt}$	${\tt max\_roll\_belt}$
##	13443	13443	13443
##	${\tt max\_picth\_belt}$	${\tt max\_yaw\_belt}$	min_roll_belt
##	13443	13443	13443
##	min_pitch_belt	min_yaw_belt	amplitude_roll_belt
##	13443	13443	13443
##	amplitude_pitch_belt	amplitude_yaw_belt	var_total_accel_belt
##	13443	13443	13443
##	avg_roll_belt	stddev_roll_belt	var_roll_belt
##	13443	13443	13443
##	avg_pitch_belt	stddev_pitch_belt	var_pitch_belt
##	13443	13443	13443
##	avg_yaw_belt	stddev_yaw_belt	var_yaw_belt
##	13443	13443	13443
##	gyros_belt_x	gyros_belt_y	gyros_belt_z
##	0	0	0
##	${\tt accel\_belt\_x}$	accel_belt_y	accel_belt_z
##	0	0	0
##	${\tt magnet\_belt\_x}$	${\tt magnet\_belt\_y}$	${\tt magnet\_belt\_z}$
##	0	0	0
##	roll_arm	pitch_arm	yaw_arm
##	0	0	0
##	${ t total\_accel\_arm}$	var_accel_arm	avg_roll_arm
##	0	13443	13443
##	${\tt stddev\_roll\_arm}$	var_roll_arm	$avg\_pitch\_arm$
##	13443	13443	13443
##	${\tt stddev\_pitch\_arm}$	$ ext{var\_pitch\_arm}$	avg_yaw_arm
##	13443	13443	13443
##	${\tt stddev\_yaw\_arm}$	var_yaw_arm	<pre>gyros_arm_x</pre>

##	13443	13443	0
##	gyros_arm_y	gyros_arm_z	accel_arm_x
##	0	0	0
##	accel_arm_y	accel_arm_z	${\tt magnet\_arm\_x}$
##	0	0	0
##	${\tt magnet\_arm\_y}$	${\tt magnet\_arm\_z}$	kurtosis_roll_arm
##	0	0	13443
##	kurtosis_picth_arm	${\tt kurtosis\_yaw\_arm}$	skewness_roll_arm
##	13443	13443	13443
##	skewness_pitch_arm	skewness_yaw_arm	${\tt max\_roll\_arm}$
##	13443	13443	13443
##	max_picth_arm	max_yaw_arm	min_roll_arm
##	13443	13443	13443
##	min_pitch_arm	min_yaw_arm	amplitude_roll_arm
##	13443	13443	13443
##	amplitude_pitch_arm	amplitude_yaw_arm	roll_dumbbell
## ##	13443 pitch_dumbbell	13443 yaw_dumbbell	0 kurtosis_roll_dumbbell
##	pron_dumbberr 0	yaw_ddmbbell O	13443
##	kurtosis_picth_dumbbell	kurtosis_yaw_dumbbell	skewness_roll_dumbbell
##	13443	13443	13443
##	skewness_pitch_dumbbell	skewness_yaw_dumbbell	max_roll_dumbbell
##	13443	13443	13443
##	max_picth_dumbbell	max_yaw_dumbbell	min_roll_dumbbell
##	13443	13443	13443
##	min_pitch_dumbbell	min_yaw_dumbbell	amplitude_roll_dumbbell
##	13443	13443	13443
##	amplitude_pitch_dumbbell	amplitude_yaw_dumbbell	total_accel_dumbbell
##	13443	13443	0
##	var_accel_dumbbell	avg_roll_dumbbell	stddev_roll_dumbbell
		avg_rorr_dumbberr	prade, Toll admippell
##	13443	13443	13443
##	13443 var_roll_dumbbell	13443 avg_pitch_dumbbell	13443 stddev_pitch_dumbbell
## ##	13443 var_roll_dumbbell 13443	13443 avg_pitch_dumbbell 13443	13443 stddev_pitch_dumbbell 13443
## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell
## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443
## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y
## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0
## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y
## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0
## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y
## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0
## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y
## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm
## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0
## ## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z 0 yaw_forearm	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0 kurtosis_roll_forearm	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm
## ## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z 0 yaw_forearm 0 kurtosis_yaw_forearm 13443	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0 kurtosis_roll_forearm 13443 skewness_roll_forearm 13443	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443
## ## ## ## ## ## ## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z 0 yaw_forearm 0 kurtosis_yaw_forearm 13443 skewness_yaw_forearm	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0 kurtosis_roll_forearm 13443 skewness_roll_forearm 13443 max_roll_forearm	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm
## ## ## ## ## ## ## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z 0 yaw_forearm 0 kurtosis_yaw_forearm 13443 skewness_yaw_forearm 13443	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0 kurtosis_roll_forearm 13443 skewness_roll_forearm 13443 max_roll_forearm 13443	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm 13443
## ## ## ## ## ## ## ## ## ##	13443 var_roll_dumbbell 13443 var_pitch_dumbbell 13443 var_yaw_dumbbell 13443 gyros_dumbbell_z 0 accel_dumbbell_z 0 magnet_dumbbell_z 0 yaw_forearm 0 kurtosis_yaw_forearm 13443 skewness_yaw_forearm 13443 max_yaw_forearm	13443 avg_pitch_dumbbell	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm 13443 min_pitch_forearm
## ## ## ## ## ## ## ## ## ## ## ## ##	13443 var_roll_dumbbell	13443 avg_pitch_dumbbell	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm 13443 min_pitch_forearm 13443
######################################	13443 var_roll_dumbbell	13443 avg_pitch_dumbbell 13443 avg_yaw_dumbbell 13443 gyros_dumbbell_x 0 accel_dumbbell_x 0 magnet_dumbbell_x 0 roll_forearm 0 kurtosis_roll_forearm 13443 skewness_roll_forearm 13443 max_roll_forearm 13443 min_roll_forearm 13443 amplitude_roll_forearm	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm 13443 min_pitch_forearm 13443 amplitude_pitch_forearm
## ## ## ## ## ## ## ## ## ## ## ## ##	13443 var_roll_dumbbell	13443 avg_pitch_dumbbell	13443 stddev_pitch_dumbbell 13443 stddev_yaw_dumbbell 13443 gyros_dumbbell_y 0 accel_dumbbell_y 0 magnet_dumbbell_y 0 pitch_forearm 0 kurtosis_picth_forearm 13443 skewness_pitch_forearm 13443 max_picth_forearm 13443 min_pitch_forearm 13443

```
##
                                                                             13443
                       13443
##
                                   stddev_roll_forearm
           avg_roll_forearm
                                                                 var_roll_forearm
##
                       13443
                                                  13443
                                                                             13443
##
          avg_pitch_forearm
                                  stddev_pitch_forearm
                                                                var_pitch_forearm
##
                       13443
                                                  13443
                                                                             13443
##
             avg_yaw_forearm
                                    stddev_yaw_forearm
                                                                   var_yaw_forearm
##
                                                                             13443
                       13443
                                                  13443
##
             gyros_forearm_x
                                       gyros_forearm_y
                                                                   gyros_forearm_z
##
                            0
                                                       0
                                                                                  0
##
             accel_forearm_x
                                       accel_forearm_y
                                                                   accel_forearm_z
##
                            0
##
           magnet_forearm_x
                                      magnet_forearm_y
                                                                 magnet_forearm_z
##
##
                      classe
##
                            0
```

NAcolumn = names(na[na > 0]) #Vector with all the columns that has NA values training\_data = training\_data[, !names(training\_data) %in% NAcolumn] names(training\_data)

```
[1] "X"
##
                                "user_name"
                                                        "raw_timestamp_part_1"
    [4] "raw_timestamp_part_2"
                                "cvtd_timestamp"
                                                        "new_window"
                                "roll_belt"
##
   [7] "num_window"
                                                         "pitch_belt"
## [10] "yaw_belt"
                                                        "gyros_belt_x"
                                "total_accel_belt"
## [13] "gyros_belt_y"
                                "gyros_belt_z"
                                                        "accel_belt_x"
                                "accel_belt_z"
## [16] "accel_belt_y"
                                                        "magnet_belt_x"
## [19] "magnet_belt_y"
                                "magnet_belt_z"
                                                        "roll_arm"
## [22] "pitch_arm"
                                "yaw_arm"
                                                        "total_accel_arm"
## [25] "gyros_arm_x"
                                "gyros_arm_y"
                                                        "gyros_arm_z"
## [28] "accel_arm_x"
                                                        "accel_arm_z"
                                "accel_arm_y"
## [31] "magnet_arm_x"
                                "magnet_arm_y"
                                                         "magnet_arm_z"
## [34] "roll_dumbbell"
                                "pitch_dumbbell"
                                                        "yaw_dumbbell"
## [37] "total_accel_dumbbell"
                                "gyros_dumbbell_x"
                                                         "gyros_dumbbell_y"
## [40] "gyros_dumbbell_z"
                                "accel_dumbbell_x"
                                                         "accel_dumbbell_y"
## [43] "accel_dumbbell_z"
                                "magnet_dumbbell_x"
                                                        "magnet_dumbbell_y"
## [46] "magnet_dumbbell_z"
                                "roll_forearm"
                                                        "pitch_forearm"
## [49] "yaw_forearm"
                                "total_accel_forearm"
                                                        "gyros_forearm_x"
## [52] "gyros_forearm_y"
                                "gyros_forearm_z"
                                                         "accel_forearm_x"
##
   [55]
       "accel_forearm_y"
                                "accel_forearm_z"
                                                        "magnet_forearm_x"
                                                        "classe"
  [58] "magnet_forearm_y"
                                "magnet_forearm_z"
```

training\_data <- training\_data[, !names(training\_data) %in% c("X", "user\_name", "raw\_timestamp\_part\_1",</pre>

For validation set:

```
na = sapply(validation, function(x) {sum(is.na(x))}) #Make a vector of all the columns and the number o
NAcolumn = names(na[na > 0]) #Vector with all the columns that has NA values
validation = validation[, !names(validation) %in% NAcolumn]
validation <- validation[, !names(validation) %in% c("X", "user_name", "raw_timestamp_part_1", "raw_timestamp_name")</pre>
```

For testing set:

```
na = sapply(testing_data, function(x) {sum(is.na(x))}) #Make a vector of all the columns and the number
NAcolumn = names(na[na > 0]) #Vector with all the columns that has NA values
testing_data = testing_data[, !names(testing_data) %in% NAcolumn]
testing_data <- testing_data[, !names(testing_data) %in% c("X", "user_name", "raw_timestamp_part_1", "r
model <- randomForest(classe ~ ., data=training_data, ntree = 50)</pre>
predictions <- predict(model, testing_data)</pre>
confusionMatrix(predictions, testing_data$classe)
## Confusion Matrix and Statistics
##
             Reference
##
## Prediction
                Α
                           C
                                D
                                     Ε
           A 1671
                     10
                                     Ω
##
                           0
                                0
           В
                 3 1124
                           2
##
                                0
            С
                      5 1024
                               12
                                     0
##
                 Ω
##
           D
                 0
                      0
                           0
                              950
                                     2
##
           Ε
                 0
                      0
                           0
                                2 1080
##
## Overall Statistics
##
##
                  Accuracy : 0.9939
##
                    95% CI: (0.9915, 0.9957)
       No Information Rate: 0.2845
##
       P-Value [Acc > NIR] : < 2.2e-16
##
##
                     Kappa : 0.9923
##
##
  Mcnemar's Test P-Value : NA
##
##
## Statistics by Class:
##
##
                        Class: A Class: B Class: C Class: D Class: E
## Sensitivity
                          0.9982 0.9868 0.9981 0.9855
                                                               0.9982
## Specificity
                          0.9976 0.9989
                                           0.9965
                                                     0.9996
                                                               0.9996
## Pos Pred Value
                          0.9941 0.9956
                                           0.9837
                                                     0.9979
                                                              0.9982
## Neg Pred Value
                          0.9993 0.9968
                                           0.9996
                                                     0.9972
                                                               0.9996
## Prevalence
                          0.2845 0.1935
                                           0.1743
                                                     0.1638
                                                               0.1839
## Detection Rate
                          0.2839 0.1910
                                           0.1740
                                                     0.1614
                                                               0.1835
## Detection Prevalence
                          0.2856
                                   0.1918
                                            0.1769
                                                     0.1618
                                                               0.1839
## Balanced Accuracy
                          0.9979
                                   0.9929
                                            0.9973
                                                     0.9925
                                                               0.9989
modelAcc <- confusionMatrix(predictions, testing_data$classe)$overall[[1]]</pre>
The model is 0.9938828 accurate.
prediction:
predictions <- predict(model, validation)</pre>
predictions
```

## B A B A A E D B A A B C B A E E A B B B

## Levels: A B C D E