Human Activity Recognition Using Smartphones' Data Code Book

The experiments have been carried out with a group of 30 volunteers within an age bracket of 19-48 years. Each pers on performed six activities (WALKING, WALKING_UPSTAIRS, WALKING_DOWNSTAIRS, SITTING, STANDING, LAYING) wearing a smartphone (Samsung Galaxy S II) on the waist. Using its embed ded accelerometer and gyroscope, we captured 3-axial linear acceleration and 3-axial angular velocity at a constant rate of 50Hz. The experiments have been video-recorded to label the data manually. The obtained dataset has been randomly partitioned into two sets, where 70% of the volunteers was selected for generating the training data and 30% the test data.

The sensor signals (accelerometer and gyroscope) were pre-processed by applying noise filters and then sampled in fixed-width sliding windows of 2.56 sec and 50% overlap (128 readings/window). The sensor acceleration signal, which has gravitational and body motion components, was separated using a Butterworth low-pass filter into body acceleration and gravity. The gravitational force is assumed to have only low frequency components, therefore a filter with 0.3 Hz cutoff frequency was used. From each window, a vector of features was obtained by calculating variables from the time and frequency domain.

Feature Selection

The features selected for this database come from the acc elerometer and gyroscope 3-axial raw signals timeAccelerom eter-XYZ and timeGyroscop-XYZ. These time domain signals were captured at a constant rate of 50 Hz. Then they were filtered using a median filter and a 3rd order low pass Butterworth filter with a corner frequency of 20 Hz to remove no ise. Similarly, the acceleration signal was then separated into body and gravity acceleration signals (timeBodyAccelerometer-XYZ and timeGravityAccelerometer-XYZ) using another low pass Butterworth filter with a corner frequency of 0.3 Hz.

Subsequently, the body linear acceleration and angular velocity were derived in time to obtain Jerk signals (timeB

odyAccelerometerJerk-XYZ and timeBodyGyroscopJerk-XYZ). A lso the magnitude of these three-dimensional signals were calculated using the Euclidean norm (timeBodyAccAccelerometerMagnitude, timeGravityAccelerometerMagnitude, timeBodyAccelerometerJerkMagnitude, timeBodyGyroscopMagnitude, timeBodyGyroscopJerkMagnitude).

Finally a Fast Fourier Transform (FFT) was applied to som e of these signals producing frequencyBodyAccelerometer-XY Z, frequencyBodyAccelerometerJerk-XYZ, frequencyBodyGyros cop-XYZ, frequencyBodyAccelerometerJerkMagnitude, frequencyBodyGyroscopJerkMagnitude.

These signals were used to estimate variables of the feat ure vector for each pattern:

'-XYZ' is used to denote 3-axial signals in the X, Y and Z directions.

timeBodyAccelerometer-XYZ timeGravityAccelerometer-XYZ timeBodyAccelerometerJerk-XYZ timeBodyGyroscop-XYZ timeBodyGyroscopJerk-XYZ timeBodyAccelerometerMagnitude timeGravityAccelerometerMagnitude timeBodyAccelerometerJerkMagnitude timeBodyGyroscopMagnitude timeBodyGyroscopJerkMagnitude frequencyBodyAccelerometer-XYZ frequencyBodyAccelerometerJerk-XYZ frequencyBodyGyroscop-XYZ frequencyBodyAccelerometerMagnitude frequencyBodyAccelerometerJerkMagnitude frequencyBodyGyroscopMagnitude frequencyBodyGyroscopJerkMagnitude

The set of variables that were estimated from these signals are:

mean(): Mean value

std(): Standard deviation

mad(): Median absolute deviation
max(): Largest value in array

min(): Smallest value in array

sma(): Signal magnitude area

energy(): Energy measure. Sum of the squares divided by the number of values.

iqr(): Interquartile range

entropy(): Signal entropy

arCoeff(): Autorregresion coefficients with Burg order e
qual to 4

correlation(): correlation coefficient between two signa
ls

maxInds(): index of the frequency component with largest
magnitude

meanFreq(): Weighted average of the frequency components
to obtain a mean frequency

skewness(): skewness of the frequency domain signal

kurtosis(): kurtosis of the frequency domain signal

bandsEnergy(): Energy of a frequency interval within the 64 bins of the FFT of each window.

angle(): Angle between to vectors.

Additional vectors obtained by averaging the signals in a signal window sample. These are used on the angle() variable:

gravityMean
timeBodyAcceleratorMean
timeBodyAcceleratorJerkMean
timeBodyGyroscopMean
timeBodyGyroscopJerkMean

The complete list of variables of each feature vector is as following:

[1] "participants"

The name of participants.

[2] "activities"

The name of activities (WALKING, WALKING_UPSTAIRS, WALKING_DOWNSTAIRS, SITTING, STANDING, LAYING)

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[360] "frequencyBodyAcceleratorJerk-bandsEnergy()-33,40"

[361] "frequencyBodyAcceleratorJerk-bandsEnergy()-41,48"

[362] "frequencyBodyAcceleratorJerk-bandsEnergy()-49,56"

[363] "frequencyBodyAcceleratorJerk-bandsEnergy()-57,64"

[364] "frequencyBodyAcceleratorJerk-bandsEnergy()-1,16"

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[365] "frequencyBodyAcceleratorJerk-bandsEnergy()-17,32"
[366] "frequencyBodyAcceleratorJerk-bandsEnergy()-33,48"
[367] "frequencyBodyAcceleratorJerk-bandsEnergy()-49,64"
[368] "frequencyBodyAcceleratorJerk-bandsEnergy()-1,24"
[369] "frequencyBodyAcceleratorJerk-bandsEnergy()-25,48"
[370]
      "frequencyBodyGyroscope-mean()-X"
[371] "frequencyBodyGyroscope-mean()-Y"
[372] "frequencyBodyGyroscope-mean()-Z"
[373] "frequencyBodyGyroscope-std()-X"
[374] "frequencyBodyGyroscope-std()-Y"
[375] "frequencyBodyGyroscope-std()-Z"
[376] "frequencyBodyGyroscope-mad()-X"
[377] "frequencyBodyGyroscope-mad()-Y"
[378] "frequencyBodyGyroscope-mad()-Z"
[379] "frequencyBodyGyroscope-max()-X"
[380] "frequencyBodyGyroscope-max()-Y"
[381] "frequencyBodyGyroscope-max()-Z"
[382]
     "frequencyBodyGyroscope-min()-X"
[383] "frequencyBodyGyroscope-min()-Y"
[384] "frequencyBodyGyroscope-min()-Z"
[385] "frequencyBodyGyroscope-sma()"
[386] "frequencyBodyGyroscope-energy()-X"
[387]
     "frequencyBodyGyroscope-energy()-Y"
[388] "frequencyBodyGyroscope-energy()-Z"
[389] "frequencyBodyGyroscope-iqr()-x"
[390] "frequencyBodyGyroscope-iqr()-Y"
[391] "frequencyBodyGyroscope-iqr()-Z"
[392]
     "frequencyBodyGyroscope-entropy()-X"
[393] "frequencyBodyGyroscope-entropy()-Y"
[394] "frequencyBodyGyroscope-entropy()-Z"
[395] "frequencyBodyGyroscope-maxInds-X"
[396] "frequencyBodyGyroscope-maxInds-Y"
[397] "frequencyBodyGyroscope-maxInds-Z"
[398] "frequencyBodyGyroscope-meanFreq()-X"
[399] "frequencyBodyGyroscope-meanFreq()-Y"
[400] "frequencyBodyGyroscope-meanFreq()-Z"
[401] "frequencyBodyGyroscope-skewness()-X"
[402] "frequencyBodyGyroscope-kurtosis()-X"
[403] "frequencyBodyGyroscope-skewness()-Y"
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[404] "frequencyBodyGyroscope-kurtosis()-Y"
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- [405] "frequencyBodyGyroscope-skewness()-Z"
- [406] "frequencyBodyGyroscope-kurtosis()-Z"
- [407] "frequencyBodyGyroscope-bandsEnergy()-1,8"
- [408] "frequencyBodyGyroscope-bandsEnergy()-9,16"
- [409] "frequencyBodyGyroscope-bandsEnergy()-17,24"
- [410] "frequencyBodyGyroscope-bandsEnergy()-25,32"
- [411] "frequencyBodyGyroscope-bandsEnergy()-33,40"
- [412] "frequencyBodyGyroscope-bandsEnergy()-41,48"
- [413] "frequencyBodyGyroscope-bandsEnergy()-49,56"
- [414] "frequencyBodyGyroscope-bandsEnergy()-57,64"
- [415] "frequencyBodyGyroscope-bandsEnergy()-1,16"
- [416] "frequencyBodyGyroscope-bandsEnergy()-17,32"
- [417] "frequencyBodyGyroscope-bandsEnergy()-33,48"
- [418] "frequencyBodyGyroscope-bandsEnergy()-49,64"
- [419] "frequencyBodyGyroscope-bandsEnergy()-1,24"
- [420] "frequencyBodyGyroscope-bandsEnergy()-25,48"
- [421] "frequencyBodyAcceleratorMagnitude-mean()"
- [422] "frequencyBodyAcceleratorMagnitude-std()"
- [423] "frequencyBodyAcceleratorMagnitude-mad()"
- [424] "frequencyBodyAcceleratorMagnitude-max()"
- [425] "frequencyBodyAcceleratorMagnitude-min()"
- [426] "frequencyBodyAcceleratorMagnitude-sma()"

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[427] "frequencyBodyAcceleratorMagnitude-energy()"
[428] "frequencyBodyAcceleratorMagnitude-iqr()"
[429] "frequencyBodyAcceleratorMagnitude-entropy()"
[430] "frequencyBodyAcceleratorMagnitude-maxInds"
[431] "frequencyBodyAcceleratorMagnitude-meanFreq()"
[432] "frequencyBodyAcceleratorMagnitude-skewness()"
[433] "frequencyBodyAcceleratorMagnitude-kurtosis()"
[434] "frequencyBodyBodyAcceleratorJerkMagnitude-mean()"
[435] "frequencyBodyBodyAcceleratorJerkMagnitude-std()"
[436] "frequencyBodyBodyAcceleratorJerkMagnitude-mad()"
[437] "frequencyBodyBodyAcceleratorJerkMagnitude-max()"
[438] "frequencyBodyBodyAcceleratorJerkMagnitude-min()"
[439] "frequencyBodyBodyAcceleratorJerkMagnitude-sma()"
[440] "frequencyBodyBodyAcceleratorJerkMagnitude-energy()
[441] "frequencyBodyBodyAcceleratorJerkMagnitude-iqr()"
[442] "frequencyBodyBodyAcceleratorJerkMagnitude-entropy
()"
[443] "frequencyBodyBodyAcceleratorJerkMagnitude-maxInds"
[444] "frequencyBodyBodyAcceleratorJerkMagnitude-meanFreq
[445] "frequencyBodyBodyAcceleratorJerkMagnitude-skewness
[446] "frequencyBodyBodyAcceleratorJerkMagnitude-kurtosis
[447] "frequencyBodyBodyGyroscopeMagnitude-mean()"
[448] "frequencyBodyBodyGyroscopeMagnitude-std()"
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[449] "frequencyBodyBodyGyroscopeMagnitude-mad()"
[450] "frequencyBodyBodyGyroscopeMagnitude-max()"
[451] "frequencyBodyBodyGyroscopeMagnitude-min()"
[452] "frequencyBodyBodyGyroscopeMagnitude-sma()"
[453] "frequencyBodyBodyGyroscopeMagnitude-energy()"
[454] "frequencyBodyBodyGyroscopeMagnitude-iqr()"
[455] "frequencyBodyBodyGyroscopeMagnitude-entropy()"
[456] "frequencyBodyBodyGyroscopeMagnitude-maxInds"
[457] "frequencyBodyBodyGyroscopeMagnitude-meanFreq()"
[458] "frequencyBodyBodyGyroscopeMagnitude-skewness()"
[459] "frequencyBodyBodyGyroscopeMagnitude-kurtosis()"
[460] "frequencyBodyBodyGyroscopeJerkMagnitude-mean()"
[461] "frequencyBodyBodyGyroscopeJerkMagnitude-std()"
[462] "frequencyBodyBodyGyroscopeJerkMagnitude-mad()"
[463] "frequencyBodyBodyGyroscopeJerkMagnitude-max()"
[464] "frequencyBodyBodyGyroscopeJerkMagnitude-min()"
[465] "frequencyBodyBodyGyroscopeJerkMagnitude-sma()"
[466] "frequencyBodyBodyGyroscopeJerkMagnitude-energy()"
[467] "frequencyBodyBodyGyroscopeJerkMagnitude-igr()"
[468] "frequencyBodyBodyGyroscopeJerkMagnitude-entropy()"
[469] "frequencyBodyBodyGyroscopeJerkMagnitude-maxInds"
[470] "frequencyBodyBodyGyroscopeJerkMagnitude-meanFreq()
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[471] "frequencyBodyBodyGyroscopeJerkMagnitude-skewness()
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- [472] "frequencyBodyBodyGyroscopeJerkMagnitude-kurtosis()
- [473] "angle(tBodyAcceleratorMean,gravity)"
- [474] "angle(tBodyAcceleratorJerkMean), gravityMean)"
- [475] "angle(tBodyGyroscopeMean,gravityMean)"
- [476] "angle(tBodyGyroscopeJerkMean,gravityMean)"
- [477] "angle(X,gravityMean)"
- [478] "angle(Y,gravityMean)"
- [479] "angle(z,gravityMean)"