

# Mobile Sensing: Spring 2015

## Exercise: 3: Solutions

Due on 26th March 2015 by 17:45 PM.

**Instructions:** All course participants are requested to submit their exercise solutions electronically to the instructors (samuli.hemminki at cs.helsinki.fi and teemu.pulkkinen at cs.helsinki.fi), as well as to the course lecturer (petteri.nurmi at cs.helsinki.fi) by the due date (latest before the exercise session). In all the exercises, do not just give the answer, but also the derivation how you obtained it. Participants are encouraged to write computer programs to derive solutions to some of the given problems.

**Ex 1.** Load SensorData1 <sup>1</sup>. containing accelerometer measurements.

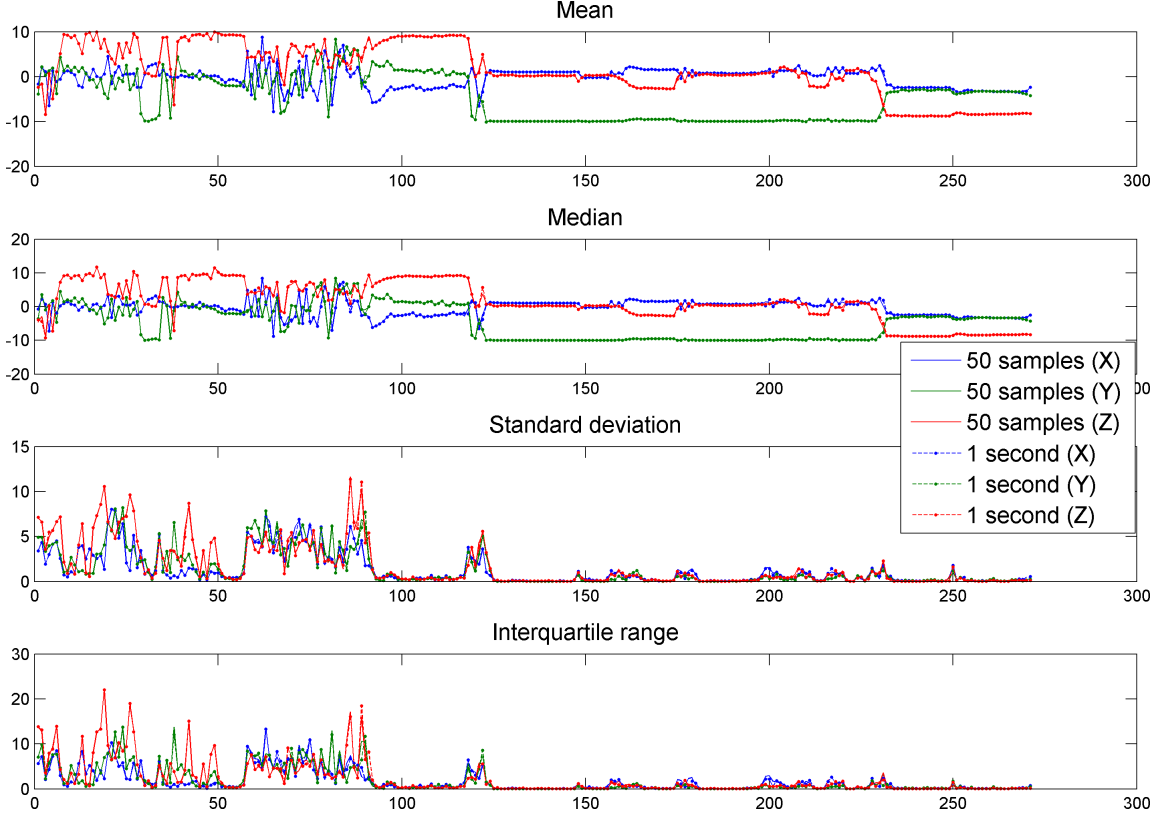
- a) Divide the data into frames of 50 samples each.
- b) Divide the data into frames of 1 second duration each.
- c) For both cases a) and b), calculate and compare the mean, median, standard deviation and interquartile range of each frame.

[Example MATLAB code for Ex 1-3: Solutions](#)

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<sup>1</sup>In the data, columns 1 to 4 corresponds to: [timestamp, x, y, z]

Visualization of the results:



**Ex 2.** Load SensorData2<sup>2</sup> containing gyroscope measurements which have been collected simultaneously with the data contained in SensorData1.

- Perform sample synchronization for the two sensors: SensorData1 and SensorData2.
- Interpolate sensor values (from both sensors) with uniform 20ms intervals, starting from the timestamp given by the first accelerometer measurement.

**Ex 3.** Consider a scenario where 4 devices,  $D_1, D_2, D_3$  and  $D_4$ , sample their microphones. Table 1 summarizes similarity  $\rho$  between the audio signals, Table 2 summarized the information value  $\alpha$  of each device and Table 3 summarizes energy costs associated with sensor sampling for each device. Additionally, we define the energy due to data transmission and processing overhead  $33mW$  per device. Information gain  $G$  of adding device  $D_i$  to a set of devices  $D_{j...n}$  is calculated using formula:  $G(D_i, D_{j...n}) = (1 - \max(\rho(D_i, D_{j...n}))) * \alpha(D_i)$

- Assuming an energy budget of  $300mW$ , write a function which finds the set of devices  $D_{i...j}$  yielding highest information. What is the achieved information?

<sup>2</sup>In the data, columns 1 to 4 corresponds to: [timestamp, x, y, z]

- b) Assuming information requirement of 7 units, find the most energy-efficient device combination.

$\rho$	$D_1$	$D_2$	$D_3$	$D_4$
$D_1$	1	0.5	0.7	0.2
$D_2$	0.5	1	0.8	0.1
$D_3$	0.7	0.8	1	0.1
$D_4$	0.2	0.1	0.1	1

Table 1: Device similarity matrix

$\alpha$	Information
$D_1$	2.8
$D_2$	5.5
$D_3$	6.2
$D_4$	2.4

Table 2: Information value

mW	Energy Costs
$D_1$	94mW
$D_2$	87mW
$D_3$	112mW
$D_4$	61mW

Table 3: Device energy cost

In addition to the solutions linked above, the solution to this task uses a separate helper function ([link](#)).

**Ex 4.** DTW / Distance

Let's do a little detective work!

In a user study on the movement patterns of customers within a supermarket environment, three location traces were recorded from three different users. In addition, one of these three users carried a cheaper and less accurate device (more noise, less samples). Due to a mixup in the study setup, however, the researchers forgot which user was carrying the cheaper device.

Your task is to figure out which user carried the faulty device. Specifically, implement the Dynamic Time Warping algorithm and compare the different user traces to the mystery

trace. Which user would you suggest carried the device?

Traces are in CSV-format, with columns representing [X,Y]-coordinates. Use the Euclidean distance as the cost function.

User 1

User 2

User 3

User Mystery

A good "sanity check" for data such as this is to plot the coordinates and inspect the paths visually. In the below picture we have plotted the routes on top of the actual floorplan of the supermarket (User1 = blue, User2 = red, User3 = green, User Mystery = black). From this we can see that the trace of the mystery user most closely resembles that of User 3 (and is in fact the only trace to visit the same aisle, for instance).

Running DTW on the given traces gives us the distances:

- User 1 - User Mystery:  $\approx 122877$
- User 2 - User Mystery:  $\approx 96016$
- User 3 - User Mystery:  $\approx 13718$

Since the DTW distance is the smallest between User 3 and the mystery user (by quite a large margin), this is our best bet on who carried the faulty device.

Example implementation (MATLAB): DTW.m

