# Machine Learning - Software Project

# ${\bf Component}\ 1$

Authors: Liviu-Ștefan Neacșu-Miclea, Răzvan-Gabriel Petec Specialization: Applied Computational Intelligence Group: 246/2

## 1 Room occupancy estimation

#### 1.1 Problem description

The addressed problem requires to estimate the number of people in a  $6m \times 4.6m$  room using the data provided by a set of sensors that measure light, temperature, sound,  $CO_2$  and movements via infrared (a visualization of the scheme of the room can be seen in Figure 1). Table 1 lists the accuracy and resolution of each used sensor.

Table 1: Sensor Specifications [SJC<sup>+</sup>18]

| Sensor      | Parameter | Resolution | Accuracy             |  |
|-------------|-----------|------------|----------------------|--|
| BH1750      | Light     | 1 Lux      | 1.2 times            |  |
| MAX4466     | Sound     | 0.01 V     | -                    |  |
| MH-Z14A     | CO2       | 5 ppm      | $\pm 50 \text{ ppm}$ |  |
| Digital PIR | Motion    | _          | _                    |  |

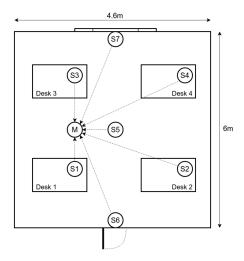


Figure 1: The star-based scheme of the sensors where the data was obtained [SJC<sup>+</sup>18].

## 1.2 Problem specification

## 1.2.1 Variables Details

| Variable              | Description   | Units                |  |  |
|-----------------------|---|----------------------|--|--|
| Input Data (Features) |   |                      |  |  |
| Date                  | Date of the recorded data   | YYYY/MM/DD           |  |  |
| Time                  | Time of the recorded data   | HH:MM:SS             |  |  |
| $S1_{-}Temp$          | Temperature reading from $S_1$  | $^{\circ}\mathrm{C}$ |  |  |
| S2-Temp               | Temperature reading from $S_2$  | $^{\circ}\mathrm{C}$ |  |  |
| $S3_{-}Temp$          | Temperature reading from $S_3$  | $^{\circ}\mathrm{C}$ |  |  |
| S4_Temp               | Temperature reading from $S_4$  | $^{\circ}\mathrm{C}$ |  |  |
| S1_Light              | Light intensity reading from $S_1$                                    | Lux                  |  |  |
| S2_Light              | Light intensity reading from $S_2$                                    | Lux                  |  |  |
| S3_Light              | Light intensity reading from $S_3$                                    | Lux                  |  |  |
| S4_Light              | Light intensity reading from $S_4$                                    | Lux                  |  |  |
| S1_Sound              | Sound level from $S_1$ measured by ADC amplifier                      | Volts                |  |  |
| S2_Sound              | Sound level from $S_2$ measured by ADC amplifier                      | Volts                |  |  |
| S3_Sound              | Sound level from $S_3$ measured by ADC amplifier                      | Volts                |  |  |
| S4_Sound              | Sound level from $S_4$ measured by ADC amplifier                      | Volts                |  |  |
| $S5\_CO2$             | Carbon dioxide concentration reading from $S_5$                       | PPM                  |  |  |
| S5_CO2_Slope          | Slope of CO <sub>2</sub> concentration values (over a sliding window) |                      |  |  |
| S6_PIR                | Binary indicator of motion detection from PIR $S_6$                   |                      |  |  |
| S7_PIR                | Binary indicator of motion detection from PIR $S_7$                   |                      |  |  |
| Output Data (Target)  |   |                      |  |  |
| Count                 | Number of people in the room  |                      |  |  |

## 1.2.2 Variables Constraints

| Variable              | Type       | Domain                  |  |  |
|-----------------------|------------|-------------------------|--|--|
| Input Data (Features) |            |                         |  |  |
| Date                  | Temporal   | 2017/12/22 - 2018/01/11 |  |  |
| Time                  | Temporal   | 00:00:00 - 23:59:59     |  |  |
| $S1_{-}Temp$          | Continuous | [1, 50] [Cho07]         |  |  |
| $S2_{-}Temp$          | Continuous | [1, 50] [Cho07]         |  |  |
| $S3_{-}Temp$          | Continuous | [1, 50] [Cho07]         |  |  |
| S4-Temp               | Continuous | [1, 50] [Cho07]         |  |  |
| S1_Light              | Integer    | {0500} [Bio21]          |  |  |
| S2_Light              | Integer    | {0500} [Bio21]          |  |  |
| S3_Light              | Integer    | {0500} [Bio21]          |  |  |
| S4_Light              | Integer    | {0500} [Bio21]          |  |  |
| S1_Sound              | Continuous | [0,  5]  [Int 10]       |  |  |
| S2_Sound              | Continuous | [0,  5]  [Int 10]       |  |  |
| S3_Sound              | Continuous | [0,  5]  [Int 10]       |  |  |
| S4_Sound              | Continuous | [0,  5]  [Int 10]       |  |  |
| $S5\_CO2$             | Integer    | {02000} [ZWETC15]       |  |  |
| S5_CO2_Slope          | Continuous | Q                       |  |  |
| S6_PIR                | Binary     | $\{0, 1\}$              |  |  |
| S7_PIR                | Binary     | $\{0, 1\}$              |  |  |
| Output Data (Target)  |            |                         |  |  |
| Count                 | Integer    | {03}                    |  |  |

 $\textbf{Note: Sensor $x$ was denoted with either $S_x$ or $Sx\_NAME$.}$ 

#### 1.3 Learning tasks specification

#### 1.3.1 Supervised Regression

- Task: Predicting a continuous non-negative variable that estimates the number of people in the room based on the sensors' measurements. This value is eventually rounded to the nearest integer in order to obtain the final result;
- **Performance measure**: Error-quantifying metrics: Mean Absolute Error, Mean Squared Error; Relationship metric: R-Squared score;
- Experience: Dataset of room ambient measurements collected over various time periods on different dates, corresponding to a number of people that occupy it.

#### 1.3.2 Supervised Classification

- Task: Classifying room occupancy levels into four categories based on sensor measurements: 0 (empty), 1 (1 people), 2 (2 people), and 3 (3 people).
- **Performance measure**: Accuracy, Precision, Recall, F1 Score; Area Under the Receiver Operating Characteristic Curve (AUC-ROC).
- Experience: Dataset of room ambient measurements collected over various time periods on different dates, corresponding to the occupancy categories (0, 1, 2, 3).

## References

- [Bio21] Biomaker. Lux light sensor (bh1750), 2021.
- [Cho07] Shein-Chung Chow. Statistical design and analysis of stability studies. Chapman and Hall/CRC, 2007.
- [Int10] Maxim Integrated. MAX4465–MAX4469 low-power, low-noise, op amps for microphone preamplifiers, 2010.
- [SJC<sup>+</sup>18] Adarsh Pal Singh, Vivek Jain, Sachin Chaudhari, Frank Alexander Kraemer, Stefan Werner, and Vishal Garg. Machine learning-based occupancy estimation using multivariate sensor nodes. In 2018 IEEE Globecom Workshops (GC Wkshps), pages 1–6. IEEE, 2018.
- [ZWETC15] LTD. Zhengzhou Winsen Electronics Technology CO. Intelligent infrared carbon dioxide module (model: Mh-z14a), 2015.