# Validating algorithms for continuous blood pressure measurement in patients with sleep apnoea

Submission date	Recruitment status	Prospectively registered
26/04/2019	No longer recruiting	☐ Protocol
Registration date	Overall study status	Statistical analysis plan
04/06/2019	Completed	Results
Last Edited	Condition category	Individual participant data
29/05/2019	Nervous System Diseases	Record updated in last year

# Plain English summary of protocol

Background and study aims

Sleep apnea is a highly prevalent sleep-related breathing disorder that affects about 10% of middle-aged adults. It is estimated that up to 90% of sleep apnea sufferers remain undiagnosed and untreated (Behar et al., 2013).

Currently, patients who are evaluated for sleep-disordered breathing at the sleep lab of UZ Leuven are hospitalised for one night during which a full-night polysomnography (PSG) is recorded. After this recording, the acquired signals are analysed by sleep experts and checked for anomalies. Even though this procedure is the gold standard in sleep medicine, it is only performed during one night and it is often associated with low comfort and high costs. Furthermore, the capacity of sleep centres is generally limited, which results in long waiting lists. At this point, for instance, a procedure to prioritize patients would improve the diagnosis and treatment of sleep apnea. Currently, the apnea/hypopnea index (AHI), which is a parameter derived from the PSG, is used to assess the severity of obstructive sleep apnea (OSA). The aim is to have an estimation of the AHI during waking hours and identification of severe sleep apnea patients using an unobtrusive system which can be executed in a home-based setting. The advantage of detection during waking hours is that the exclusion of many confounding factors during sleep. The autonomic nervous system has complex behaviour during sleep. Its activity is variating as the body cycles through REM and non-REM sleep phases. Performing the experiment during waking hours, the extra challenge of sleep classification through wearable sensors in patients with potentially suffering from sleep apnea is put aside.

Furthermore, individuals suffering from moderate to severe apnea experience an elevation in sympathetic activity of the nervous system. This elevation is a key contributor to hypertension (Rossi et al., 2013), which can lead to cardiovascular and cerebrovascular diseases without proper follow-up. Invasive blood pressure (BP) measurement exhibits the highest accuracy, though involves training and risks. This method is generally applied in intensive care units. Non-invasive measurement systems such as a mercury sphygmanometer or oscillometric blood pressure devices are highly accurate as well. However, these do not provide continuous BP measurement nor are they suitable for home-based measurement (Wang et al., 2018). The

second aim of this study is to develop a wearable and continuous BP measurement device in order to identify and follow-up a hypertensive population.

#### Who can participate?

Participants are patients referred to the sleep lab for a diagnostic polysomnography because of suspicion of sleep apnea will be considered to participate in the trial upon signature of the informed consent. Participants should be 18 years or older, have a body mass index below 55 kg/m2 and should not suffer from atrial fibrillation.

#### What does the study involve?

- 1. The patient is presented with an informed consent form (ICF)
- 2. Included patients are attached to the PSG PPG and ECG sensors before BP measurements. PPG is attached to the middle finger of the non-dominant hand.
- 2.1. Adhesive patches containing reflective PPG sensors are used. The patches are attached to the patient's wrist and upper arm on the side of the non-dominant hand. The upper arm sensor is placed high enough such that BP measurement can be taken below the sensor.
- 2.2. An adhesive patch containing an ECG sensor is attached to the patient's chest.
- 2.3. A fingerclip PPG sensor is put on the patient's index finger of the non-dominant hand.
- 3. A BP measure is taken twice with the patient under resting conditions and after the patient was allowed to rest for at least 5 minutes. There is at least a 10-minute interval between BP measurements. All measurements are performed before the patients go to sleep.

#### What are the possible benefits and risks of participating?

The study is carried out within clinical routine and corresponding procedures. Since the custom measuring system with sensors is completely non-invasive, no adverse reactions are expected and there is no additional risk expected to the patient, nor to the investigator. No benefits are present for the participant apart from providing aid in clinical research for continuous blood pressure measurements and simplified sleep apnea screening.

#### Where is the study run from?

The study is run in the Sleeplab of UZ Leuven, Leuven, Belgium.

When is the study starting and how long is it expected to run for?

The study itself starts 15/04/2019 and is expected to run for a maximum of 6 months.

#### Who is funding the study?

The study is funded by Verhaert and KU Leuven under the eWatch project.

#### Who is the main contact?

The main contact is Dorien Huysmans (dorien.huysmans@esat.kuleuven.be).

The principal investigator is Dries Testelmans (Herestraat 49, 3000 Leuven).

#### Study website

N/A

# Contact information

# Type(s)

Public

#### Contact name

#### Ms Dorien Huysmans

#### **ORCID ID**

http://orcid.org/0000-0002-0500-9894

#### Contact details

Kasteelpark Arenberg 10 Leuven Belgium 3001 016 37 92 69 dorien.huysmans@kuleuven.be

# Additional identifiers

### **EudraCT/CTIS** number

Nil known

#### **IRAS** number

#### ClinicalTrials.gov number

Nil known

# Secondary identifying numbers

S62173

# Study information

#### Scientific Title

Blood pressure derivation from short term raw PPG signals measured by a wearable device.

#### Acronym

N/A

# Study objectives

The purpose of this study is the validation of algorithms for continuous blood pressure measurement. The overall goal is the development of algorithms based on the analysis of wearable PPG data for fast and cheap assessment of BP in patients suffering from sleep apnoea.

# Ethics approval required

Old ethics approval format

# Ethics approval(s)

Approved 18/01/2019, Ethical Commission Research UZ/KU Leuven (Herestraat 19, 3000 Leuven, Belgium; ec@uzleuven.be; 016 34 86 00), ref: B322201938732.

# Study design

Single-centre observational cross-sectional cohort study

# Primary study design

#### Observational

## Secondary study design

Cross sectional study

## Study setting(s)

Hospital

#### Study type(s)

Other

#### Participant information sheet

No participant information sheet available.

## Health condition(s) or problem(s) studied

Sleep apnoea

#### **Interventions**

The algorithms will be first developed using an online database, i.e. Medical Information Mart for Intensive Care II (MIMIC II), which contains BP measurements using intra-arterial blood pressure, ECG and PPG. Then, the algorithms will be validated using the PPG and ECG data collected in the UZ Leuven sleep lab together with measurements of BP using the cuff.

Included patients are attached to the PSG PPG and ECG sensors before BP measurements. PPG is attached to the middle finger of the non-dominant hand.

- 1. Adhesive patches containing reflective PPG sensors are used. The patches are attached to the patient's wrist and upper arm on the side of the non-dominant hand. The upper arm sensor is placed high enough such that BP measurement can be taken below the sensor.
- 2. An adhesive patch containing an ECG sensor is attached to the patient's chest.
- 3. A fingerclip PPG sensor is put on the patient's index finger of the non-dominant hand.

After connection of all sensors (PSG + wearable), the synchronisation button of the PSG is pressed. This action supports the synchronisation of the wearable sensors with the PSG.

A BP measure is taken twice with the patient under resting conditions and after the patient was allowed to rest for at least 5 minutes. There is at least a 10-minute interval between BP measurements. All measurements are performed before the patients go to sleep. The synchronisation button of the PSG is pressed during every BP measurement. The BP measurement is taken on the arm of the dominant hand.

# Intervention Type

Device

#### Phase

Not Applicable

#### Primary outcome measure

The accuracy of blood pressure values estimated from wearable PPG is compared against values obtained using a blood pressure cuff at baseline during wake hours. The error (mean and

standard deviation) between the estimated systolic BP/diastolic BP and the cuff value will be calculated. A T-test will evaluate significant differences. Bland-Altman analysis will be used to check the interchangeability of the two methods.

## Secondary outcome measures

Parameters derived from polysomnography and wearable data during waking hours at baseline will be evaluated to differentiate patients with severe sleep apnea (AHI >= 30) from patients with milder or no sleep apnea (AHI < 30). In order to determine the best parameters that can differentiate patients with different AHI, two groups of patients will be created using the dataset collected for the first goal. One group will contain only patients with AHI < 30 and the other group will contain matched subjects suffering from patients with AHI  $\geq$  30. Patients will be matched one-by-one using age, gender and BMI. This information is contained in the 'LUCS: Vragenlijst' questionnaire. For each computed parameter, the differences between the groups will be tested using the Wilcoxon test. In addition, apart from looking at significant levels ( $\alpha$ =0. 05), different classifiers based on linear discriminant analysis, Support Vector Machines (SVM), and Least-Squares SVM will be implemented for the separation of apnea patients with high and low AHI. Finally, the accuracy of the separation will be also analyzed using the F1 score.

# Overall study start date

01/02/2018

### Completion date

15/04/2020

# **Eligibility**

#### Key inclusion criteria

Referred to the sleep lab for diagnostic polysomnography because of suspicion of sleep apnoea.

# Participant type(s)

Patient

# Age group

Adult

#### Sex

Female

### Target number of participants

100

#### Key exclusion criteria

- 1. Younger than 18 years.
- 2. Body Mass Index > 40 kg/m2.
- 3. Diagnosed with atrial fibrillation.
- 4. Have a pacemaker.
- 5. Dark skin tone.

#### Date of first enrolment

15/04/2019

#### Date of final enrolment

15/10/2019

# Locations

#### Countries of recruitment

Belgium

#### Study participating centre

Multidisciplinair centrum voor slaapmonitoring (slaaplabo) of UZ Leuven

UZ Leuven, Herestraat 49, 3000 Leuven.

Leuven

Belgium

3000

# Sponsor information

# Organisation

Agentschap Innoveren en Ondernemen

# Sponsor details

Koning Albert II-laan 35, box 12

Brussels

Belgium

1030

080020555

info@vlaio.be

#### Sponsor type

Government

#### Website

www.vlaio.be

#### **ROR**

https://ror.org/032xdry56

# Funder(s)

# Funder type

Government

#### Funder Name

Agentschap Innoveren en Ondernemen

#### Alternative Name(s)

Flanders Innovation and Entrepreneurship, AGENCY FOR INNOVATION & ENTREPRENEURSHIP, VLAIO

#### **Funding Body Type**

Government organisation

#### **Funding Body Subtype**

National government

#### Location

Belgium

# **Results and Publications**

#### Publication and dissemination plan

A conference paper on screening obstructive sleep apnea during wake using polysomnography data is planned for 01/10/2019. A journal paper on screening obstructive sleep apnea during wake using wearable device is planned for 01/08/2020.

# Intention to publish date

01/08/2020

# Individual participant data (IPD) sharing plan

All information collected during the study will be stored on a computer of the UZ Leuven. The identity of the patient will be replaced by an identification code. Only the data administrators (Prof. B. Buyse en Prof. D. Testelmans, Slaaplabo/Pneumologie, UZ Leuven) will know this data is related to the patient. Only the coded data will be transferred to the administrator of the data server of the sponsor (Koen Van Bossche, Verhaert, Hogenakkerhoekstraat 21, 9150 Kruibeke).

# IPD sharing plan summary

Not expected to be made available