

# Timing and Sequence Matter: Investigating the Relationship between Sleep and Day-time Events

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## Outline of Research Project

### Background

The effect of time-of-day has been well-studied in sports science surrounding human physical performances. Yet it is not clear if the effect of time-of-day also correlates to sleep quality.

**Hypothesis:** the timing and sequence of day-time events, in addition to the events per se, may have an impact on our sleep.

**Objective:** to investigate the relationships between night sleep quality and the timing and sequential patterns of day time events

### Research Questions

Investigating relationship between sleep and day-time events

#### 1. Measuring sleep

Despite of the convenience of consumer sleep tracking devices, do they produce valid results?

#### 2. Measuring day-time events

How to reduce the burden of events logging in studying daily activities?

#### 3. Modelling relationships

How is sleep associated to the temporal and sequential patterns of diurnal events?

**Impact:** new data collection approach for non-invasive longitudinal studies; new knowledge on human sleep

## WP1: Validation of Consumer Wearable Sleep Tracking Devices

### Methodology

#### 1. Data collection



23 healthy participants (14 males, 21~30 years)

Fitbit Charge 2 + medical 1-channel EEG



Sleep tracking for 3 nights at home

#### 2. Data analysis

Epoch-wise (30s) comparison → 4 X 4 confusion matrix  
 Pearson correlation coefficients → accuracy predictors

### Results

#### 1. Confusion matrix

Medical \ Fitbit	Wake	Light	Deep	REM
Wake	38%±20%	3%±2%	3%±11%	5%±6%
Light	48%±19%	69%±8%	30%±24%	32%±20%
Deep	6%±11%	22%±70%	64%±30%	3%±9%
REM	8%±7%	6%±6%	3%±8%	60%±25%

#### 2. Accuracy predictors

Lower **ratio of NREM** and higher **ratio of REM** are associated to higher rate of correct detection of light epochs and lower rate of mis-classifying light epochs as REM.

Higher **SE**, **TST** and longer **N2** are associated to higher rate of correct detection on REM epochs and lower rate of mis-classifying deep and REM epochs as light sleep.

## WP2: Development of Low-burden Events Logging and Sensing Platform

### Methodology

#### Pervasive sensing + machine learning



- 6:00 wake up
- 6:30 breakfast
- 7:00 go to work
- 19:00 dinner
- 20:00 bath

### Expected Outcomes

A platform that automatically detects significant diurnal events based on multimodal sensing data

## WP3: Data Mining on Relationship between Sleep and Diurnal Events

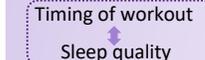
### Methodology

#### Sequential pattern mining

- 6:00 wake up
- 6:30 breakfast
- 7:00 go to work



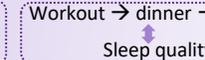
- 17:00 work out
- 19:30 dinner
- 20:20 walk
- 21:00 bath



- 6:00 wake up
- 6:30 breakfast
- 7:00 go to work



- 17:30 work out
- 19:30 dinner
- 20:20 bath
- 21:00 skin care



- 6:00 wake up
- 6:30 breakfast
- 7:30 work out
- 16:00 shopping
- 20:30 dinner
- 22:00 back home
- 22:30 skin care

### Expected Outcomes

Better understanding on the temporal and sequential patterns of lifestyle that associate to good/poor sleep