

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

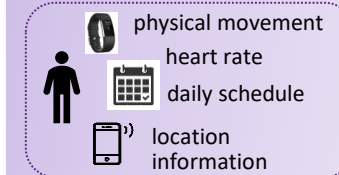
Lower **ratio of NREM** and higher **ratio of REM** are associated to higher rate of correct detection of light epochs and lower rate of mis-classifying light epochs as REM.

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

Timing of workout
↓
Sleep quality

- 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

Workout → dinner → bath
↓
Sleep quality

- 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