

Karlskrona, Sweden

ECHORD experiment PsyIntEC

Feasibility demonstration project

targeting

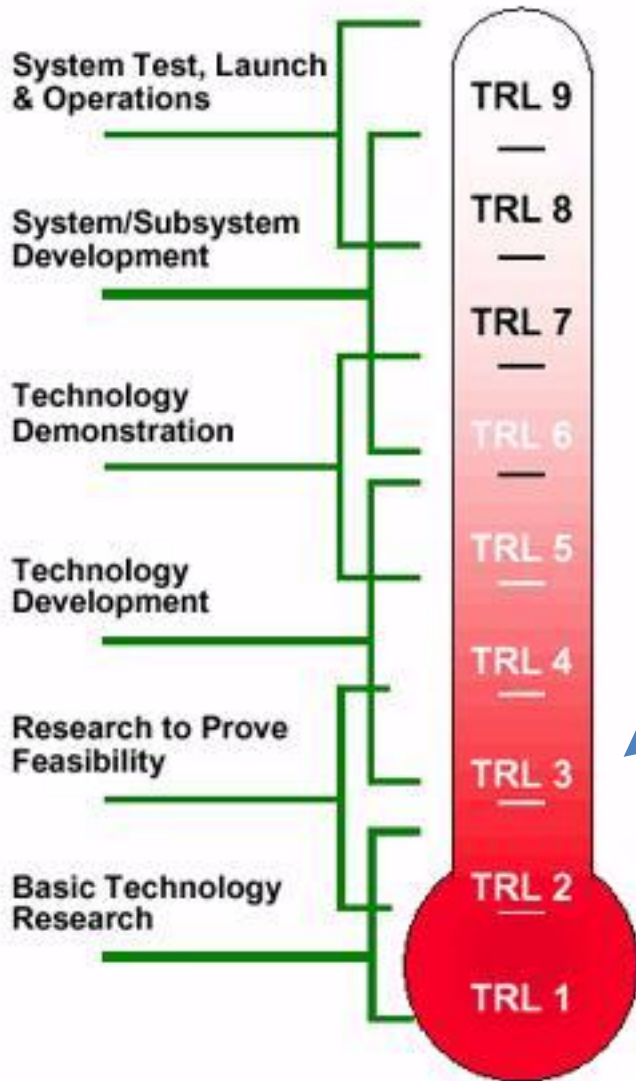
Human-Robot Interfacing and Safety

Dr. Johan Hagelbäck

Project idea



- Joint human-robot work cell.
- A human co-worker collaboratively solves a reference task with a robot.
- Measure affective states in the human co-worker,
- ... and compare to doing the same task alone or collaboratively with another human.
- ... and use that knowledge to adapt robot behavior, biofeedback (ongoing).



- Feasibility Demonstration.
- Development of a workcell for measuring affective states in HRI.
- Experiments to build a human affect model in HRI.
- Development and demonstration of biofeedback (ongoing).

Collaborative task

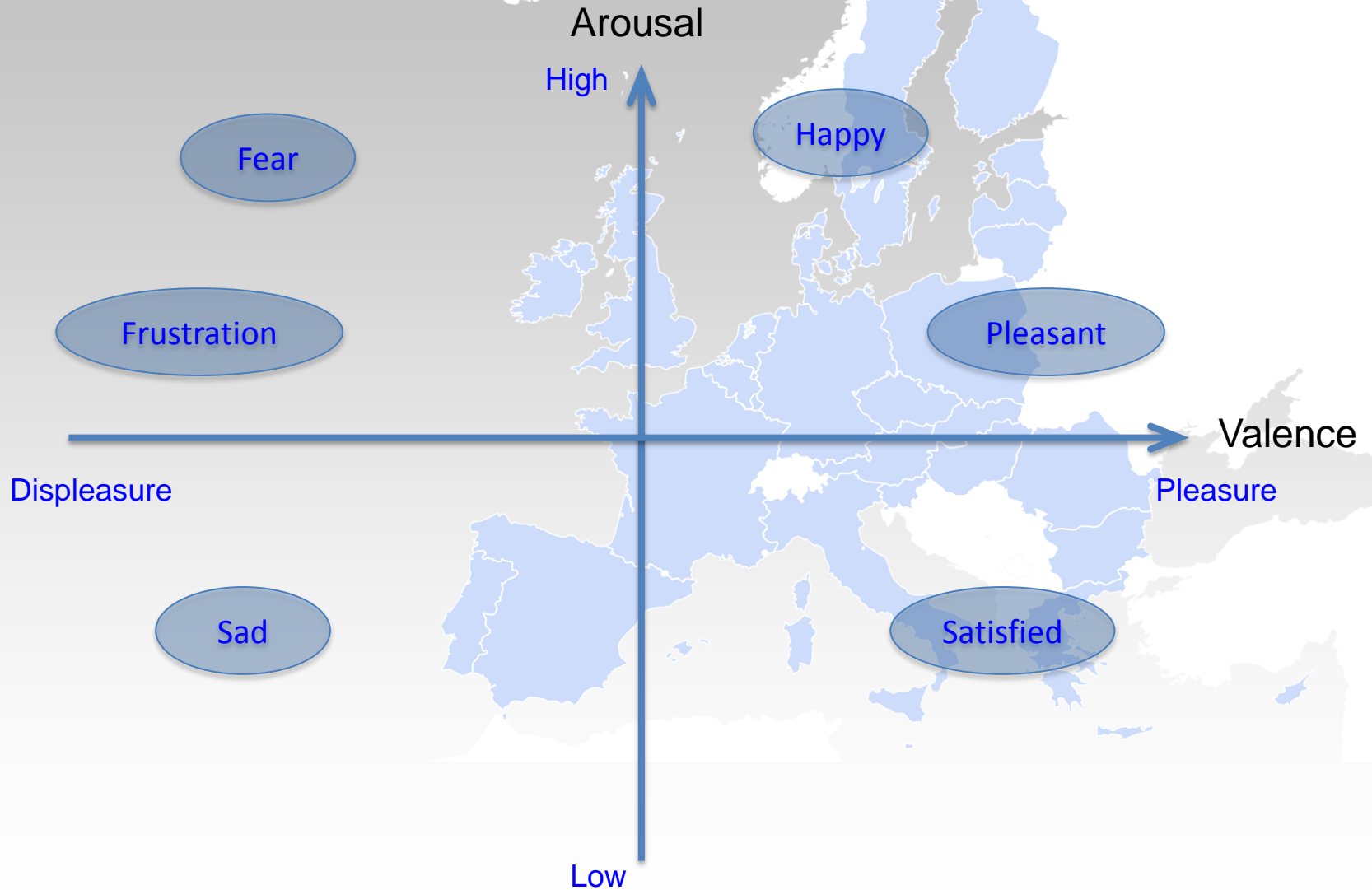
- Towers of Hanoi
- Single-player game, two-player game by using turn-taking.
- Relatively easy to understand for (most) participants, but requires some thought to complete.



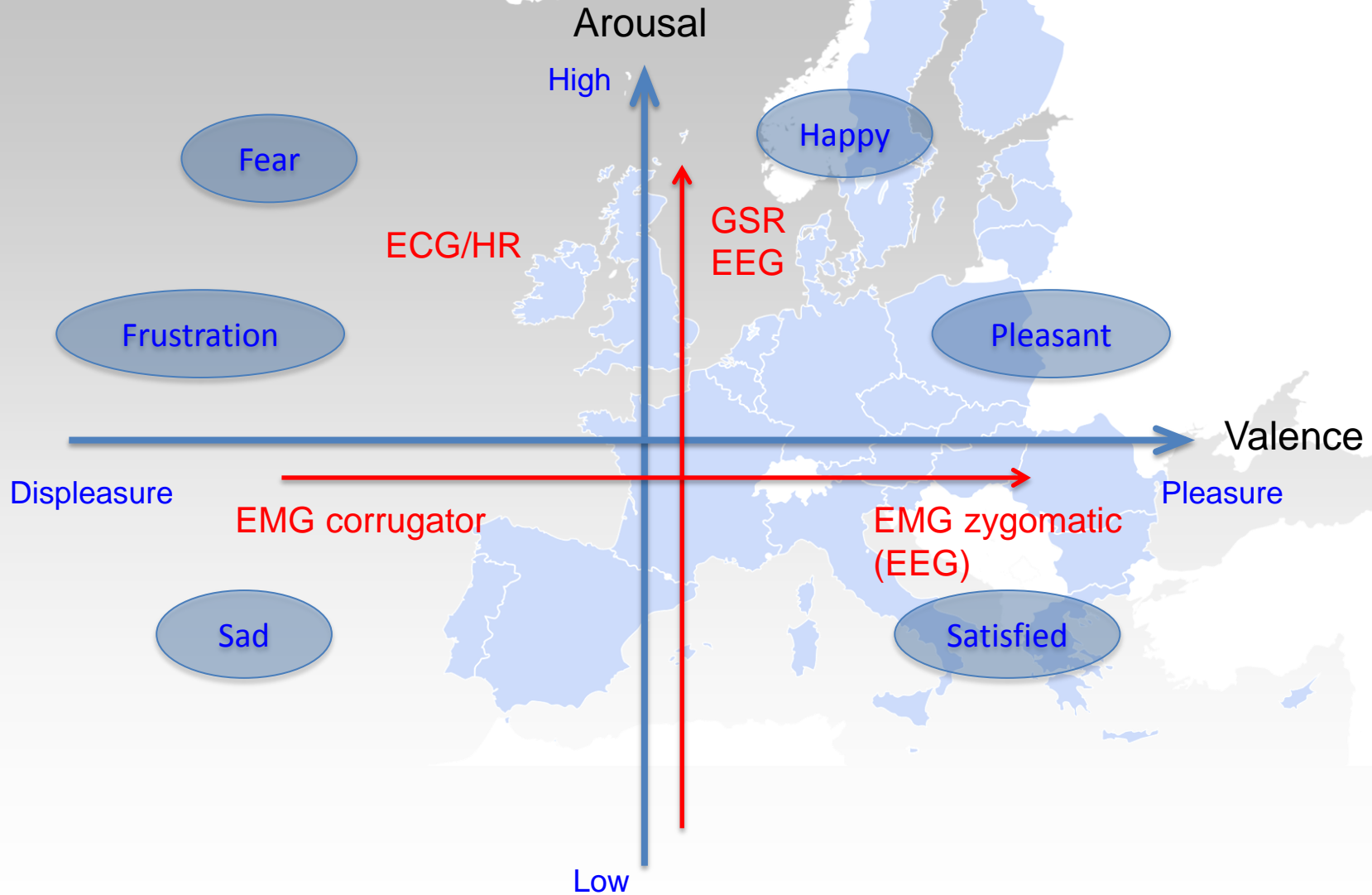
Psychophysiology sensors

| Sensor | Measure |
|----------------------------------|-----------------------------------------------------|
| EEG 8 electrodes in frontal lobe | Electrical activity in the brain. |
| ECG | Heart rate. |
| EMG corrugator | Facial muscle activity at the eyebrow. |
| EMG zygomatic | Facial muscle activity at the corners of the mouth. |
| GSR | Skin conductance in the palm. |

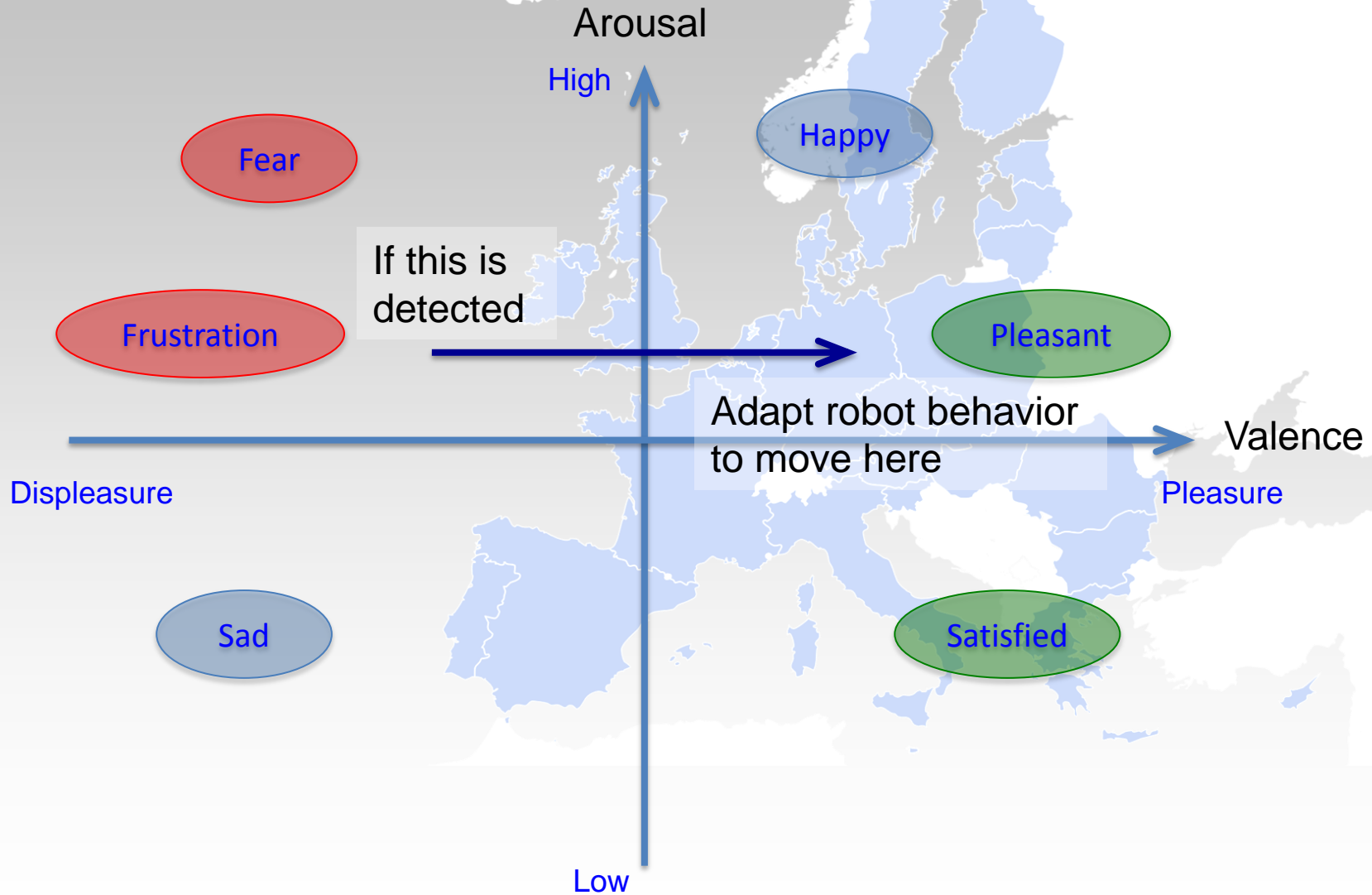
Affective states



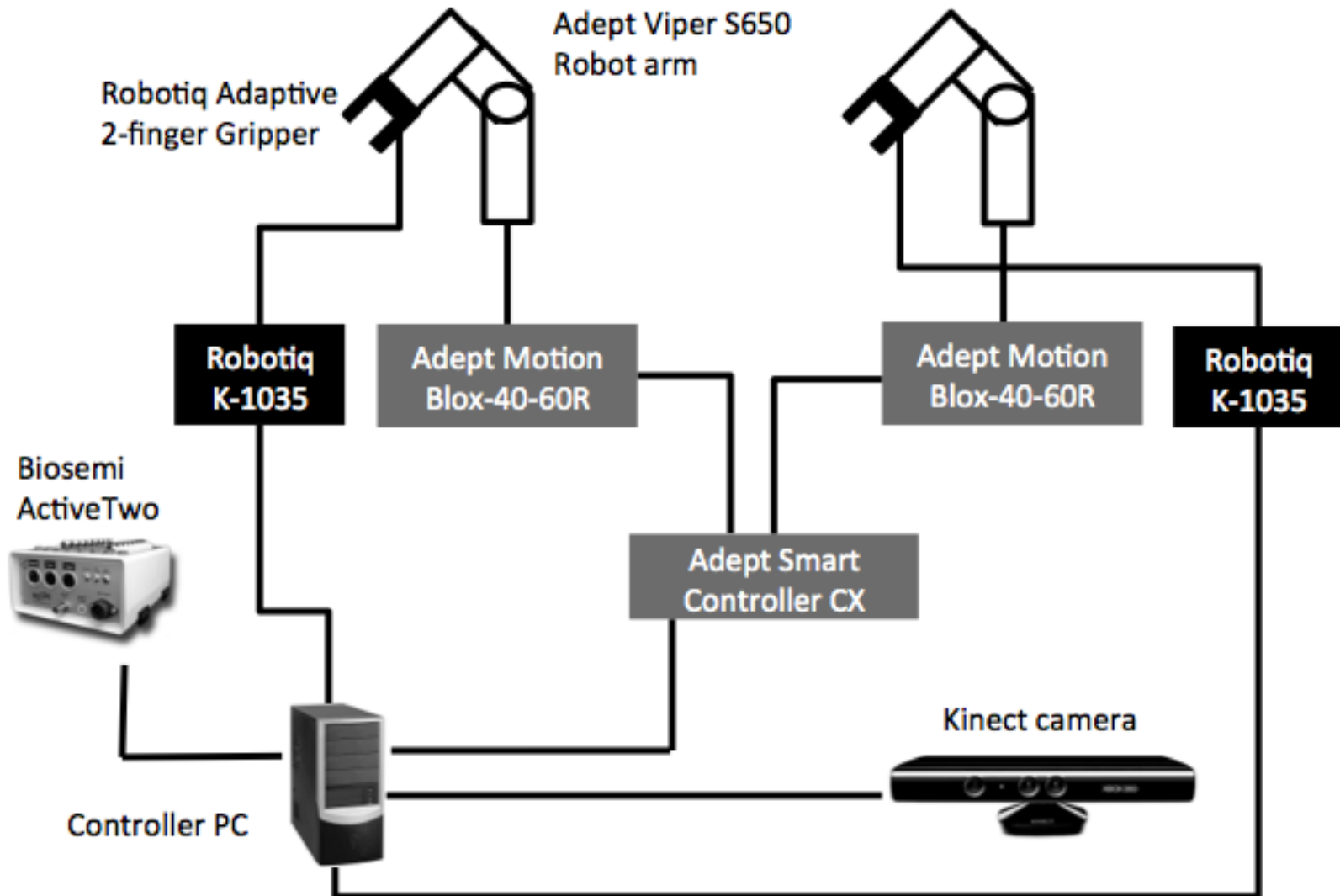
Affective states



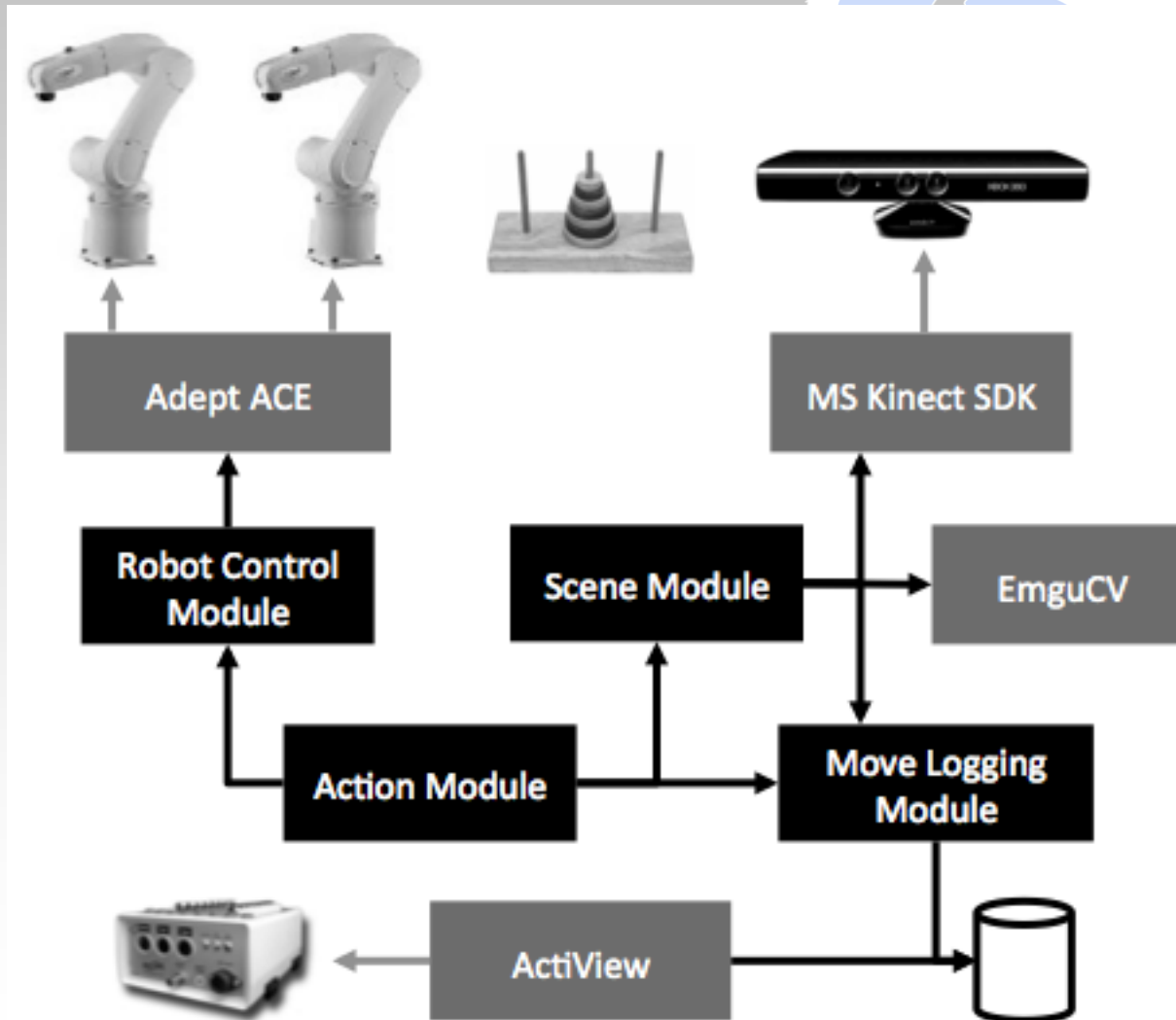
Adaptive robot behavior



Hardware setup



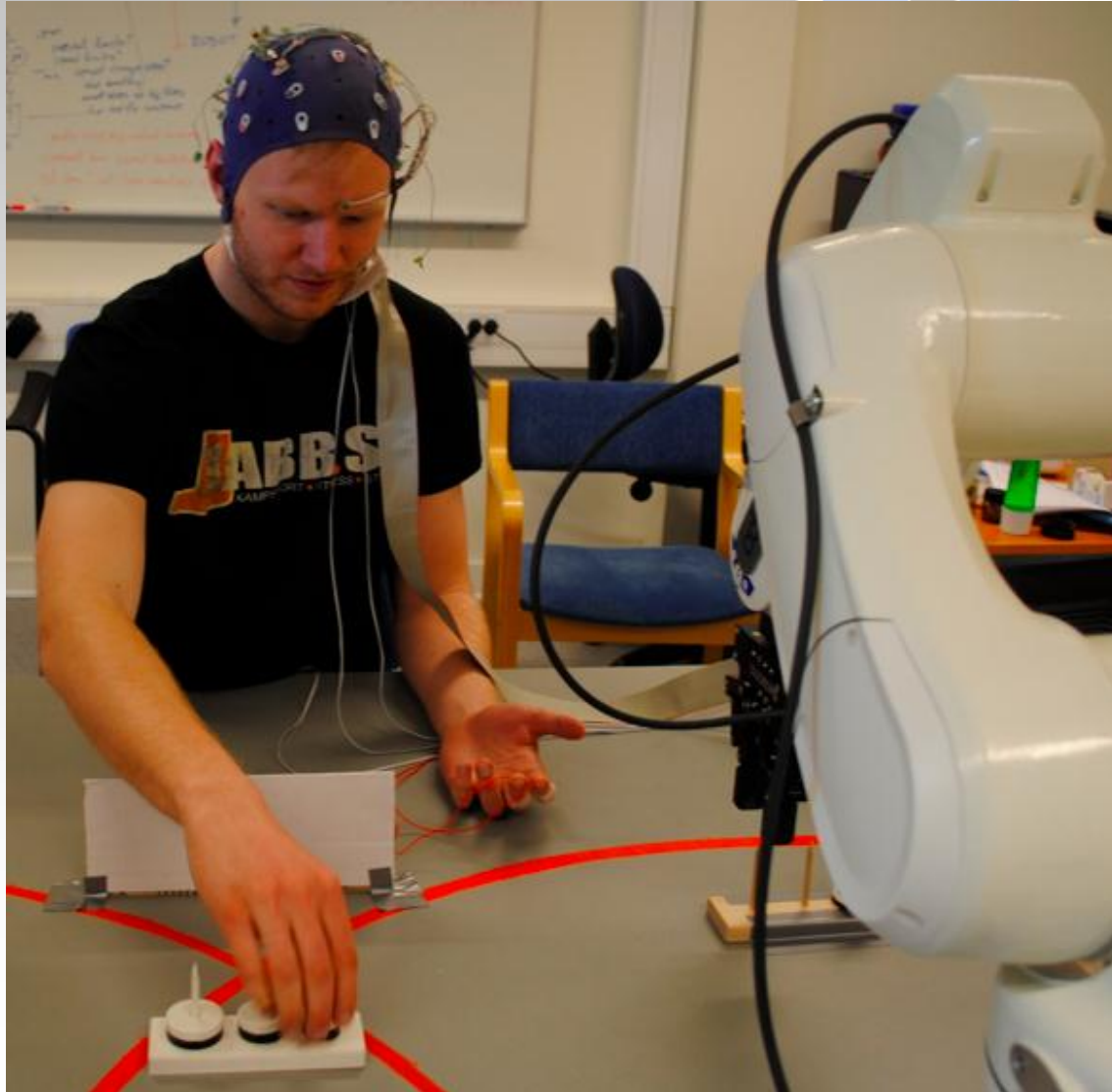
Software setup



Work scene

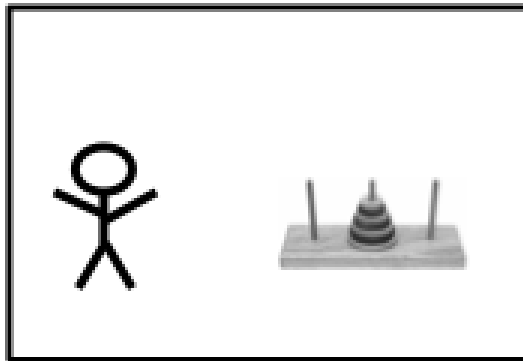


Work scene

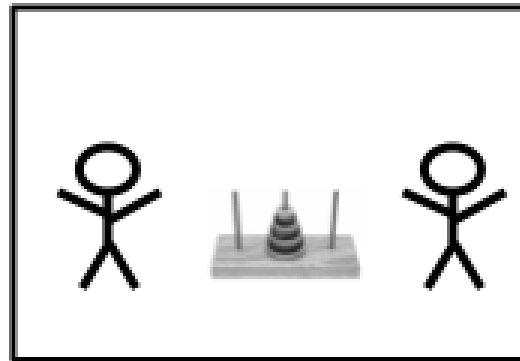


Experiment

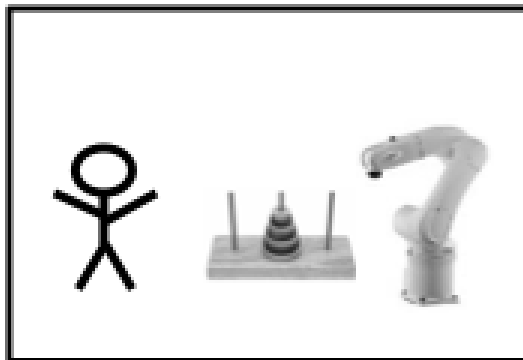
- Four experiment conditions:



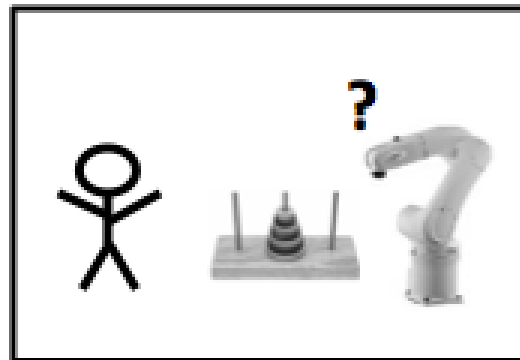
Single Human, SH



Human-Human, HH



Human-Robot, HR



Human-Robot unpred., HRu

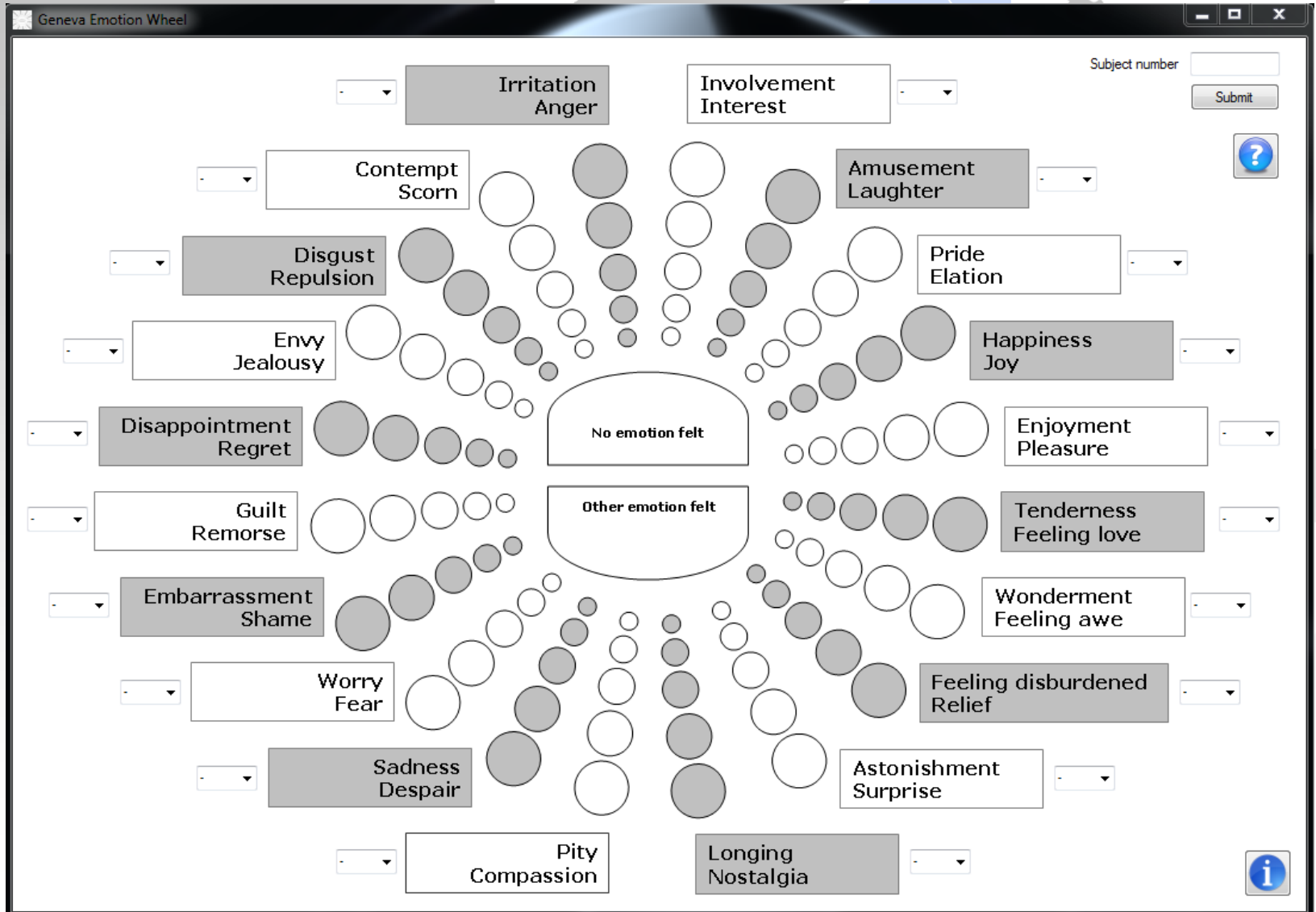
Experiment



- Three games per condition (in total 12 games)
- Psychophysiological data from sensors
- Geneva Emotion Wheel (GEW)
 - Subjective feelings
- Video

- 70 participants
- 90 mins each

GEW



DATA PROCESSING

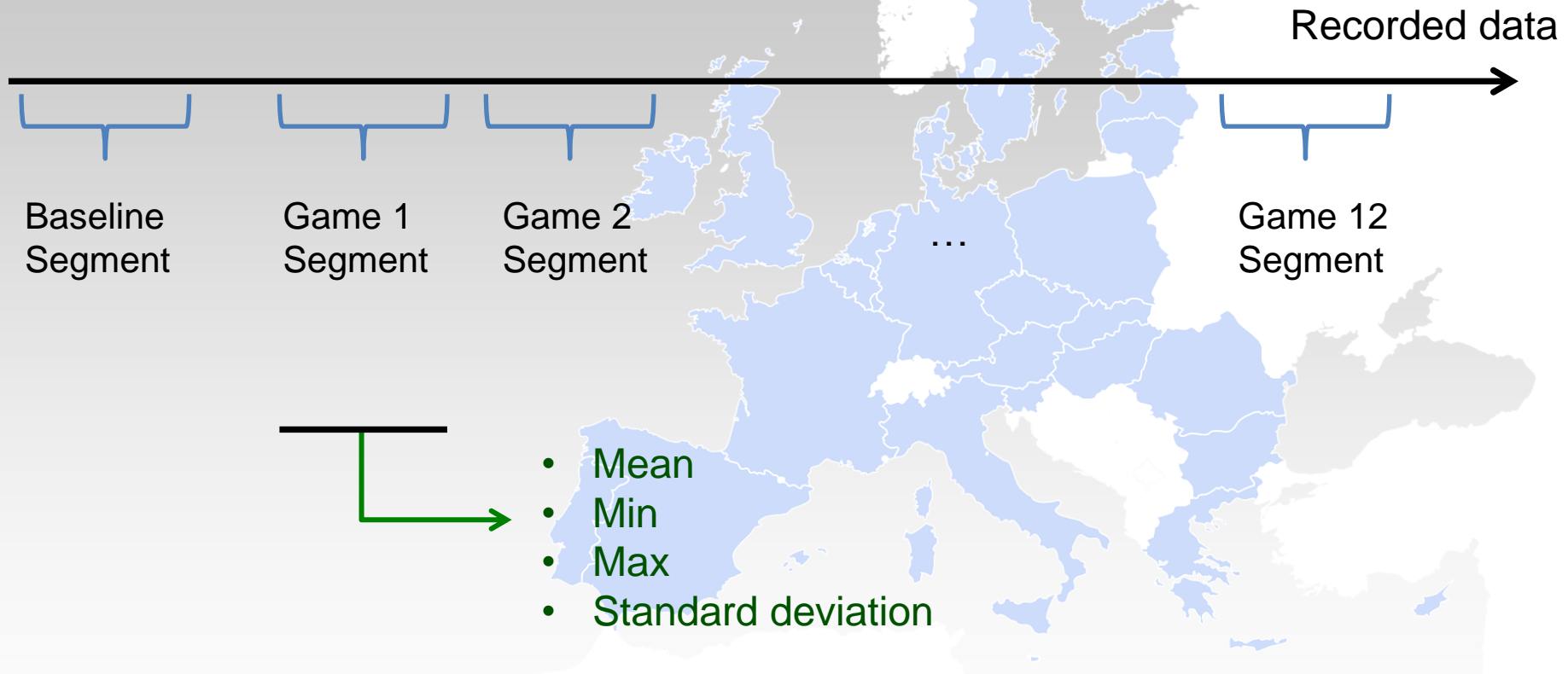


Removal of recording errors

- Data points out-of-bounds of value range for a sensor were removed.

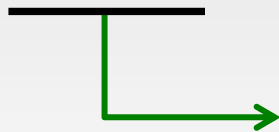
| Sensor | Amount of data removed |
|----------------|------------------------|
| EEG | 17.7% |
| ECG | 21.4% |
| EMG corrugator | 5% |
| EMG zygomatic | 13.2% |
| GSR | 6.1% |

Cut data into segments



Baseline Removal

BL = mean value of baseline segment



- Mean - BL
- Min - BL
- Max - BL
- Standard deviation

Average over all participants

- Game 1 Condition 1 Participant n_1 is averaged with Game 1 Condition 1 Participant n_2
- Different order for participants

N=70



- Mean: $\text{mean} [(\text{mean-BL})_1, (\text{mean-BL})_2, \dots, (\text{mean-BL})_{70}]$
- Min: Global minimum $(\text{data-BL})_n$
- Max: Global maximum $(\text{data-BL})_n$
- Standard deviation: $\text{mean} [\text{std}_1, \text{std}_2, \dots, \text{std}_{70}]$

Data Values

| Sensor | SH | | | | HH | | | |
|------------|-------|--------|--------|--------|-------|--------|--------|--------|
| | Avg | StdDev | Min | Max | Avg | StdDev | Min | Max |
| EMGC | 1894 | 4311 | -9055 | 11060 | 1938 | 4277 | -9251 | 11947 |
| EMGZ | 1583 | 3540 | -5308 | 9665 | 1105 | 3111 | -6421 | 8502 |
| GSR | 846.8 | 811.8 | -985.5 | 3447.1 | 1130 | 774.3 | -525.2 | 3227.6 |
| Heart rate | 2.816 | 5.911 | -11.46 | 21.74 | 2.300 | 5.384 | -12.44 | 15.26 |
| EEG | 919 | 2431 | -3937 | 6600 | 1166 | 2523 | -3948 | 7687 |

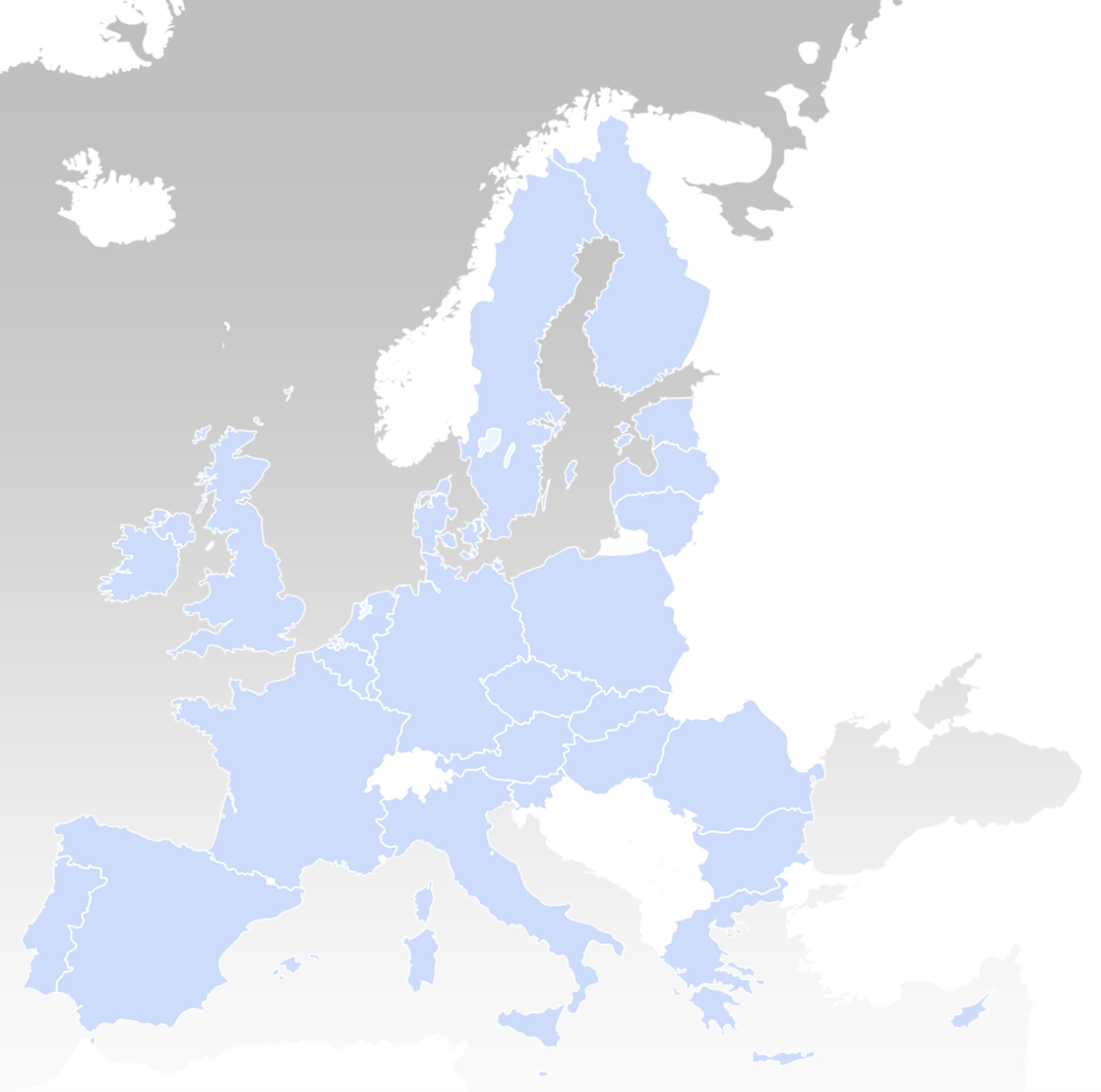
| Sensor | HR | | | | HRu | | | |
|------------|-------|--------|---------|--------|--------|--------|---------|--------|
| | Avg | StdDev | Min | Max | Avg | StdDev | Min | Max |
| EMGC | 1997 | 4051 | -6443 | 11740 | 2439 | 4623 | -7989 | 11966 |
| EMGZ | 1092 | 3555 | -6931 | 9759 | 1498 | 3898 | -6818 | 9853 |
| GSR | 767.7 | 896.6 | -1281.2 | 3302.6 | 688.1 | 874.3 | -1433.5 | 2791.4 |
| Heart rate | 1.427 | 5.783 | -12.97 | 19.86 | 0.4977 | 4.638 | -11.08 | 13.10 |
| EEG | 1146 | 2586 | -3287 | 7425 | 1212 | 2576 | -3899 | 7790 |

Comparison between Conditions

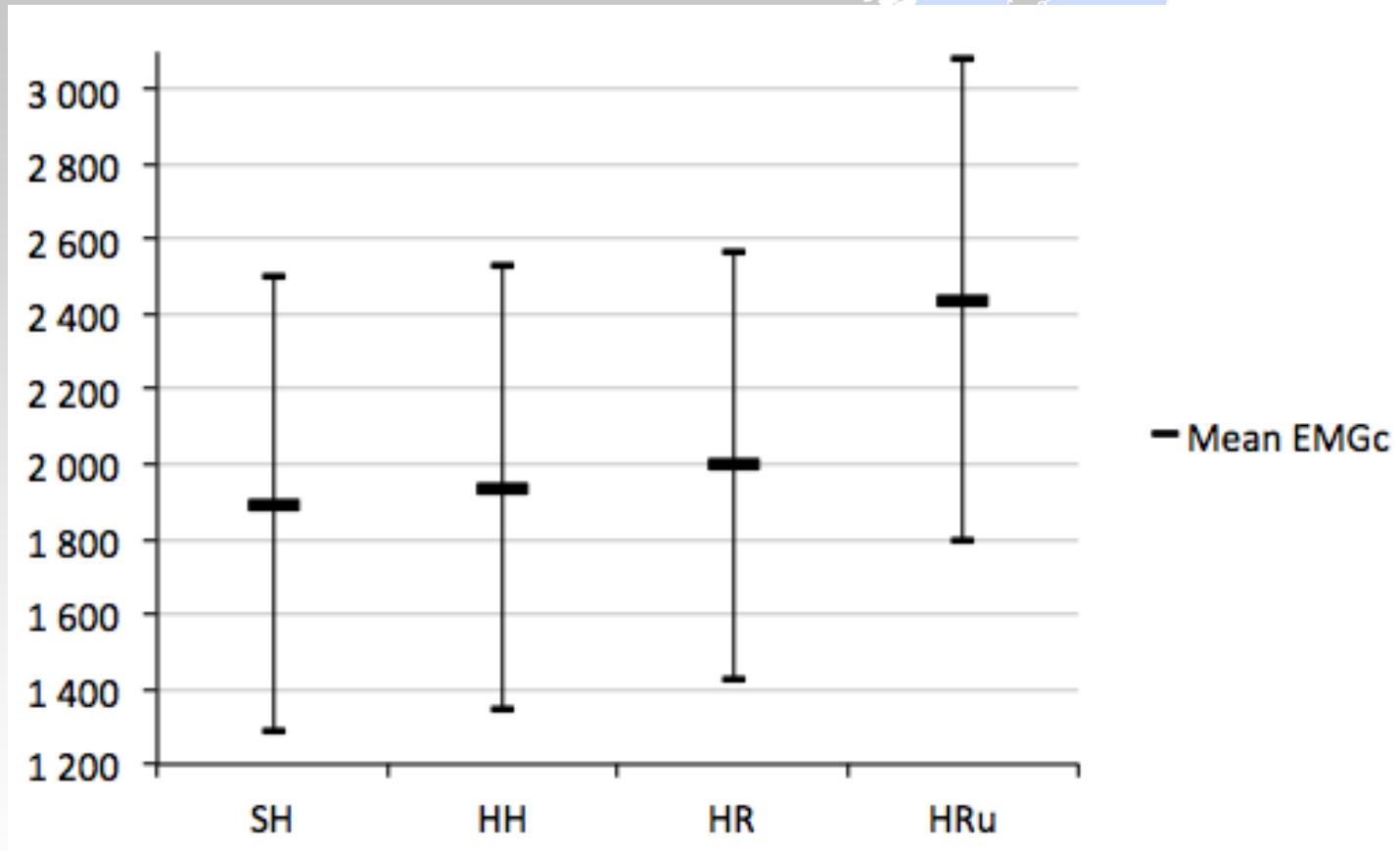


1. Compare mean values between the different conditions:
 - Single Human, SH
 - Human-human, HH
 - Human-Robot, HR
 - Human-Robot unpredictable, HRu
2. See if there are any noticeable differences in activation with, our without robots.

RESULTS

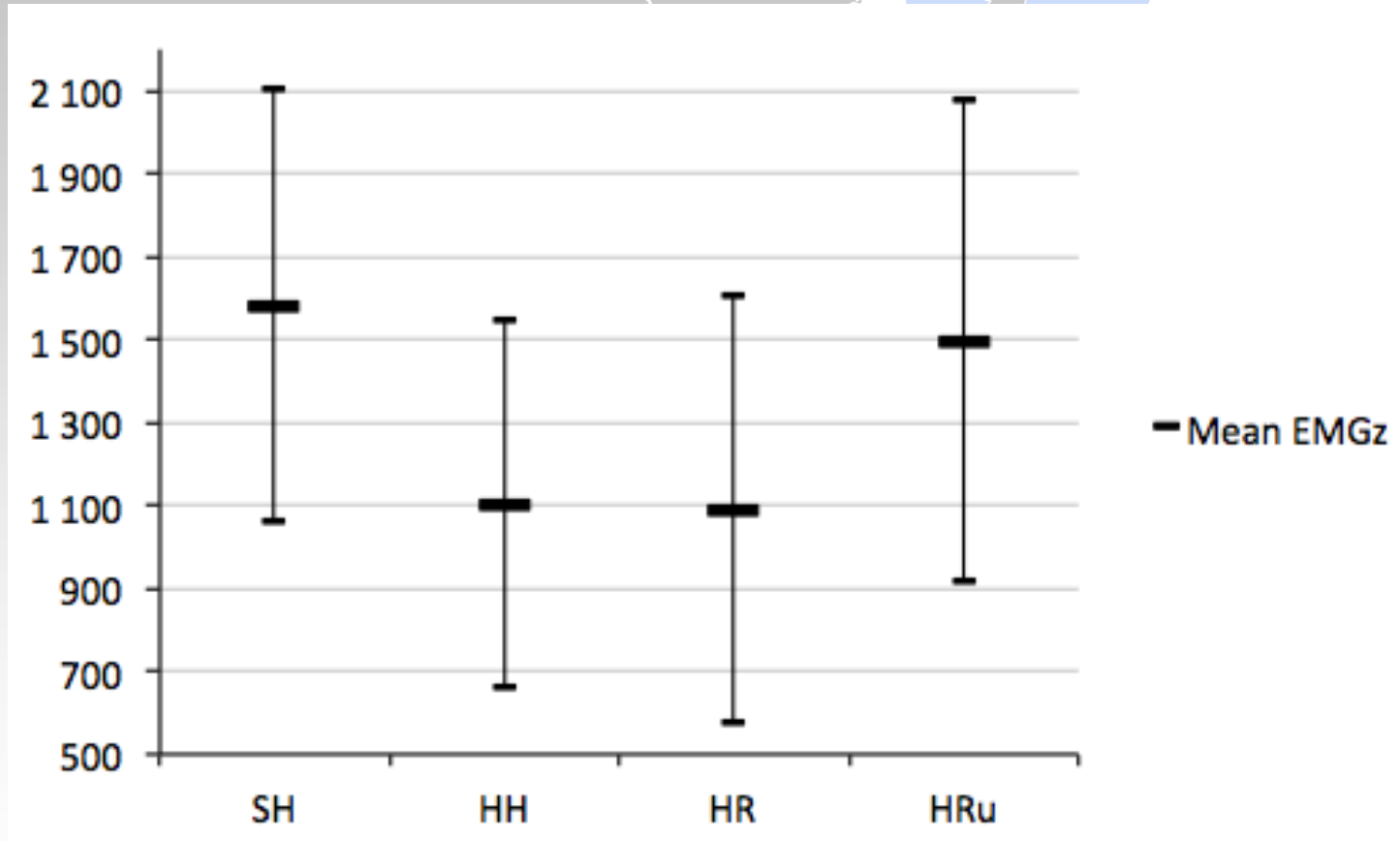


EMG corrugator



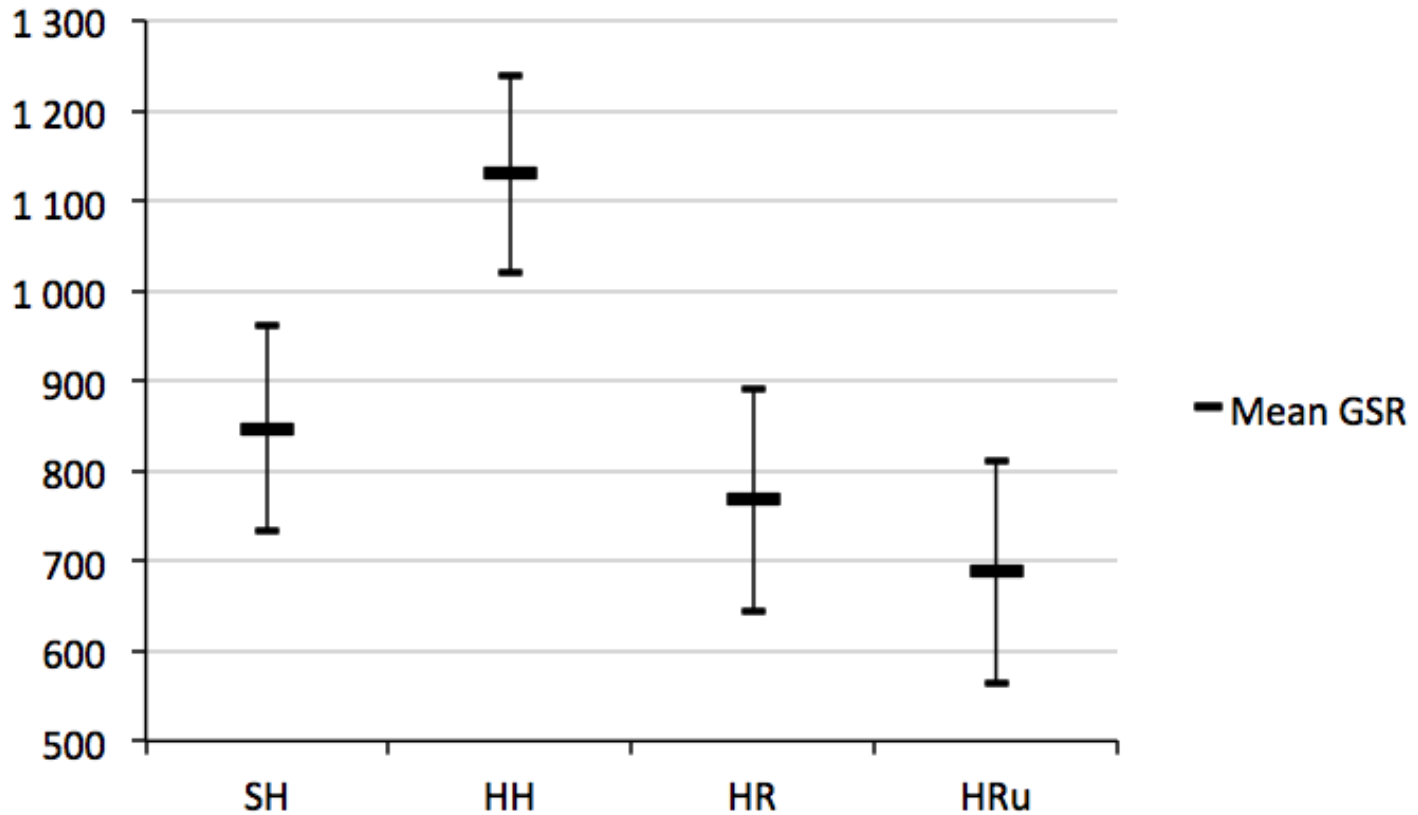
Good indicator of negative valence (displeasure)

EMG zygomatic



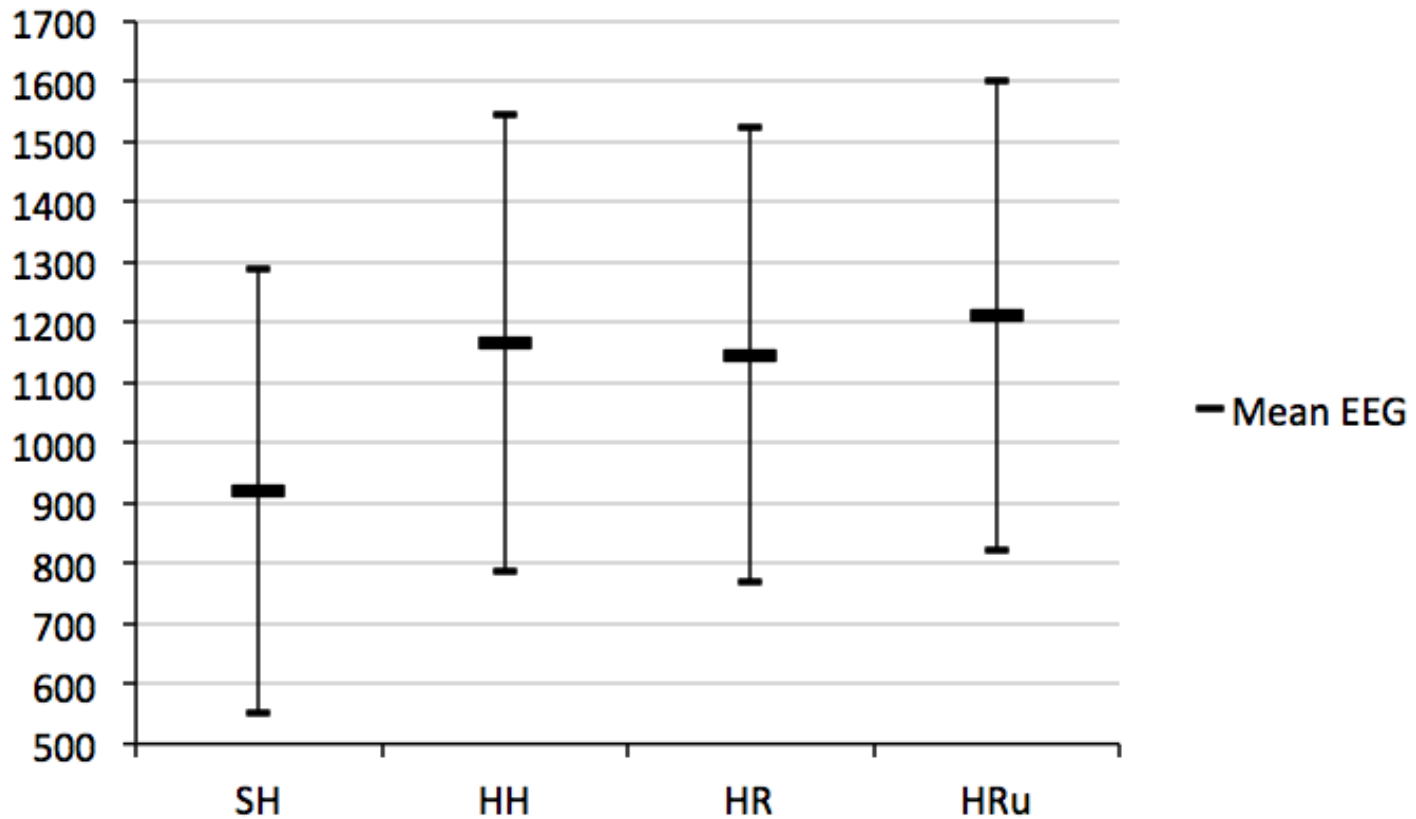
Good indicator of positive valence (pleasure)

GSR



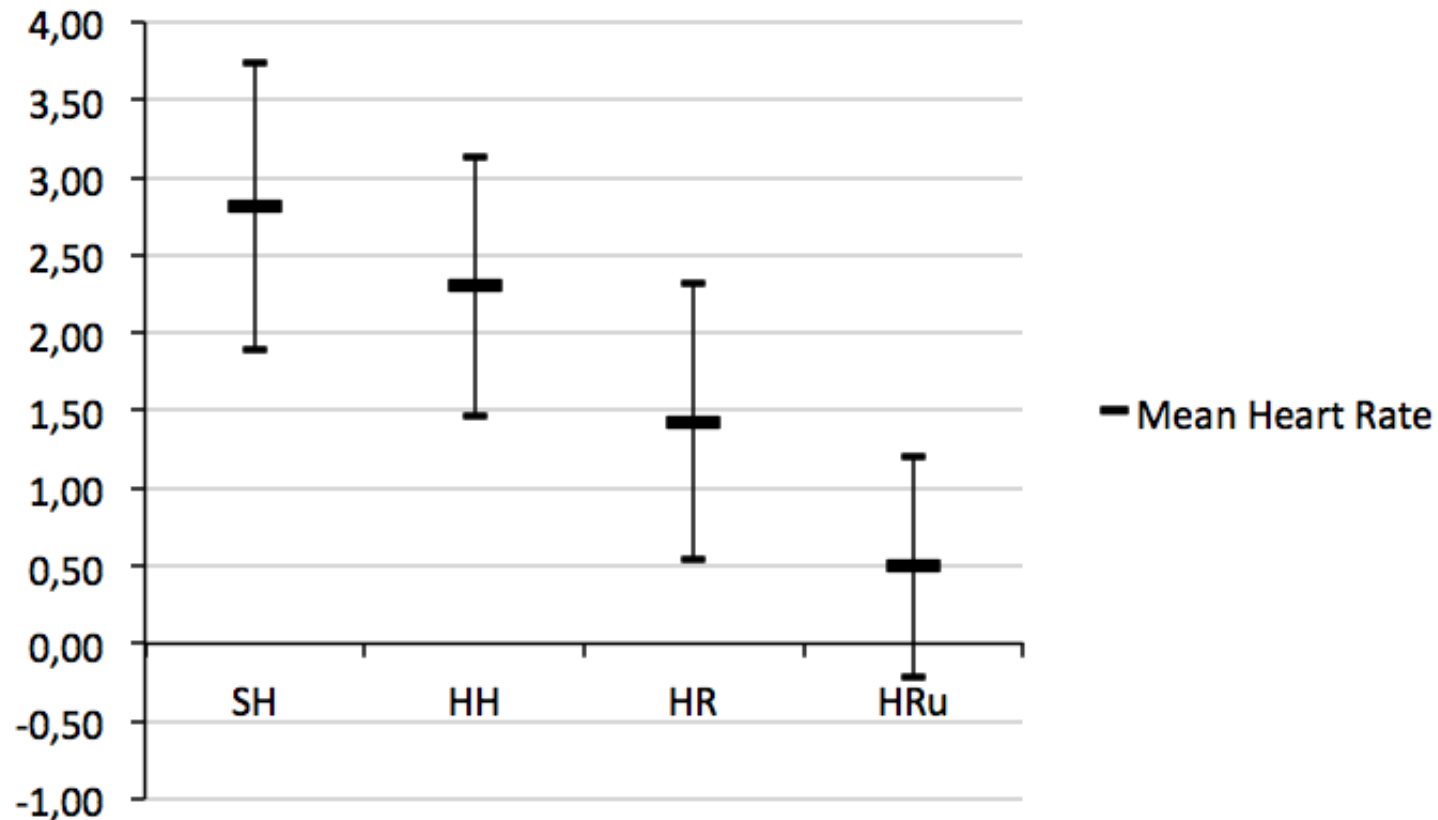
Good indicator of arousal

EEG



Good indicator on mental activity and attention

Heart Rate



Good indicator of arousal, especially for negative valence (displeasure)

Statistical Analysis

- One-way analysis of variance (ANOVA),
 $\alpha = 0.01$

| Sensor | Significance (* is significant) |
|----------------|---------------------------------|
| EEG | 0.716 |
| Heart Rate | 0.001* |
| EMG corrugator | 0.564 |
| EMG zygomatic | 0.405 |
| GSR | 0.000* |

Statistical Analysis

- Post-hoc analysis using Fisher's least significant difference, $\alpha = 0.01$

| | | HH | HR | HRu |
|------------|----|--------|--------|--------|
| GSR | SH | 0.001* | 0.348 | 0.062 |
| | HH | | 0.000* | 0.000* |
| | HR | | | 0.345 |
| Heart Rate | SH | 0.393 | 0.022 | 0.000* |
| | HH | | 0.146 | 0.003* |
| | HR | | | 0.122 |

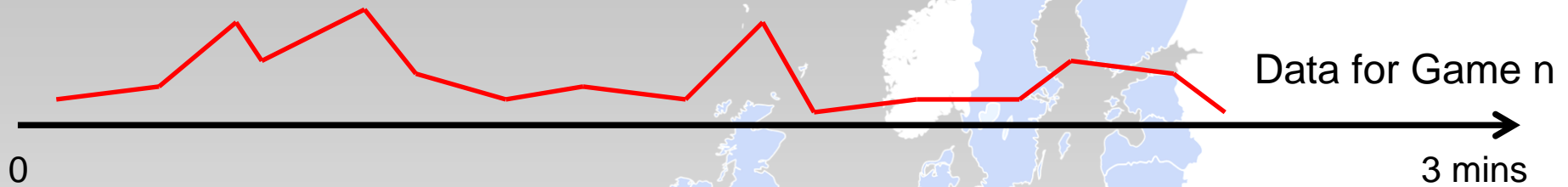
CONCLUSIONS



Is there a difference between with or without robots?

- EMG sensors show a clear increase in activation for positive and negative valence in HRu.
- Very small differences for HR compared to without robots.
- No clear differences in arousal. Heart rate indicates decreased arousal with robots.
- Increased mental load and attention for all collaborative tasks rather than with/without robots.

Limitations 1



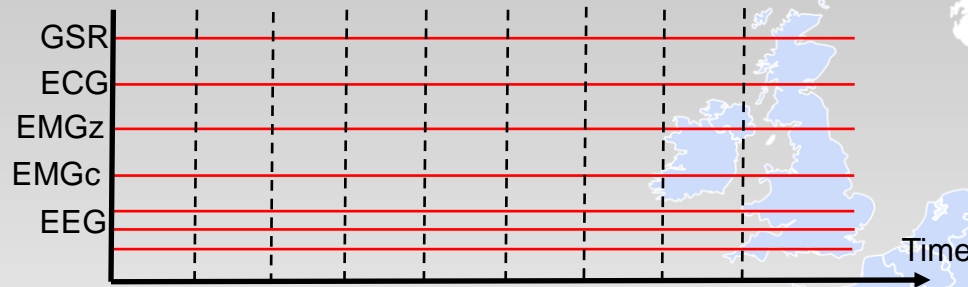
- Emotions are short-lived affective states.
- Lots of things can happen during a game that lasts 2-3 mins.
- Mean values fail to detect spikes.
- Analysis on shorter time segments, for example per move, can give better results and give insight into contradictions.

Limitations 2



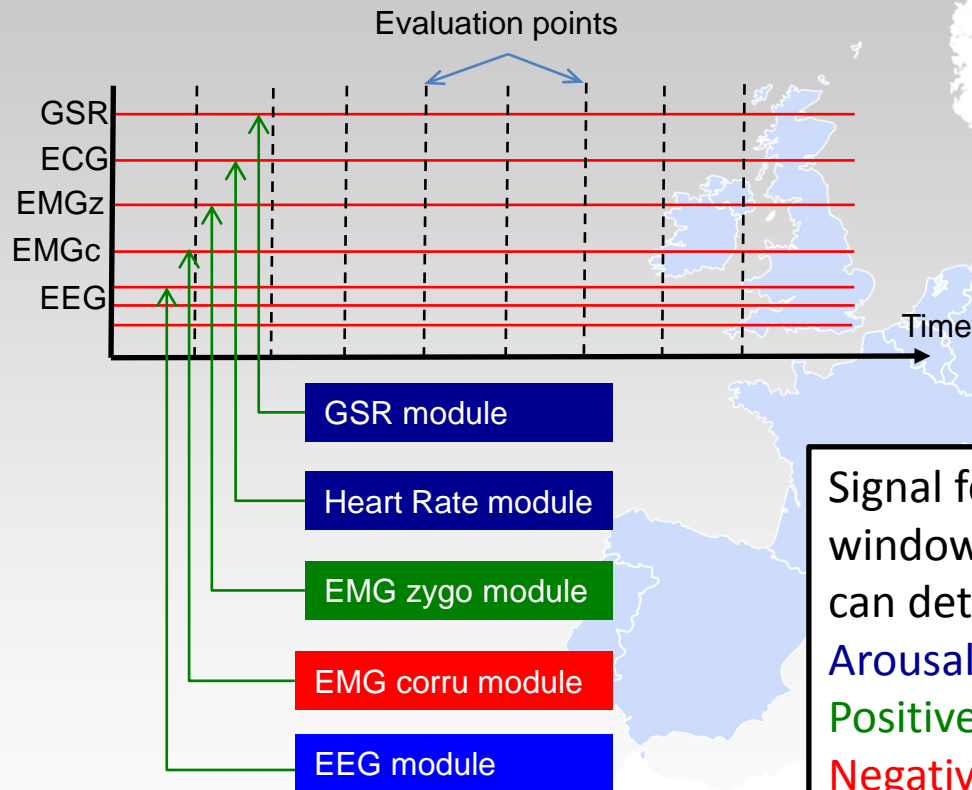
- EMG activity increases progressively from the beginning to the end of a task.
- A linear regression baseline could give better, more significant results compared to a constant baseline.

Biofeedback system (in progress)



Runtime reading of signals.

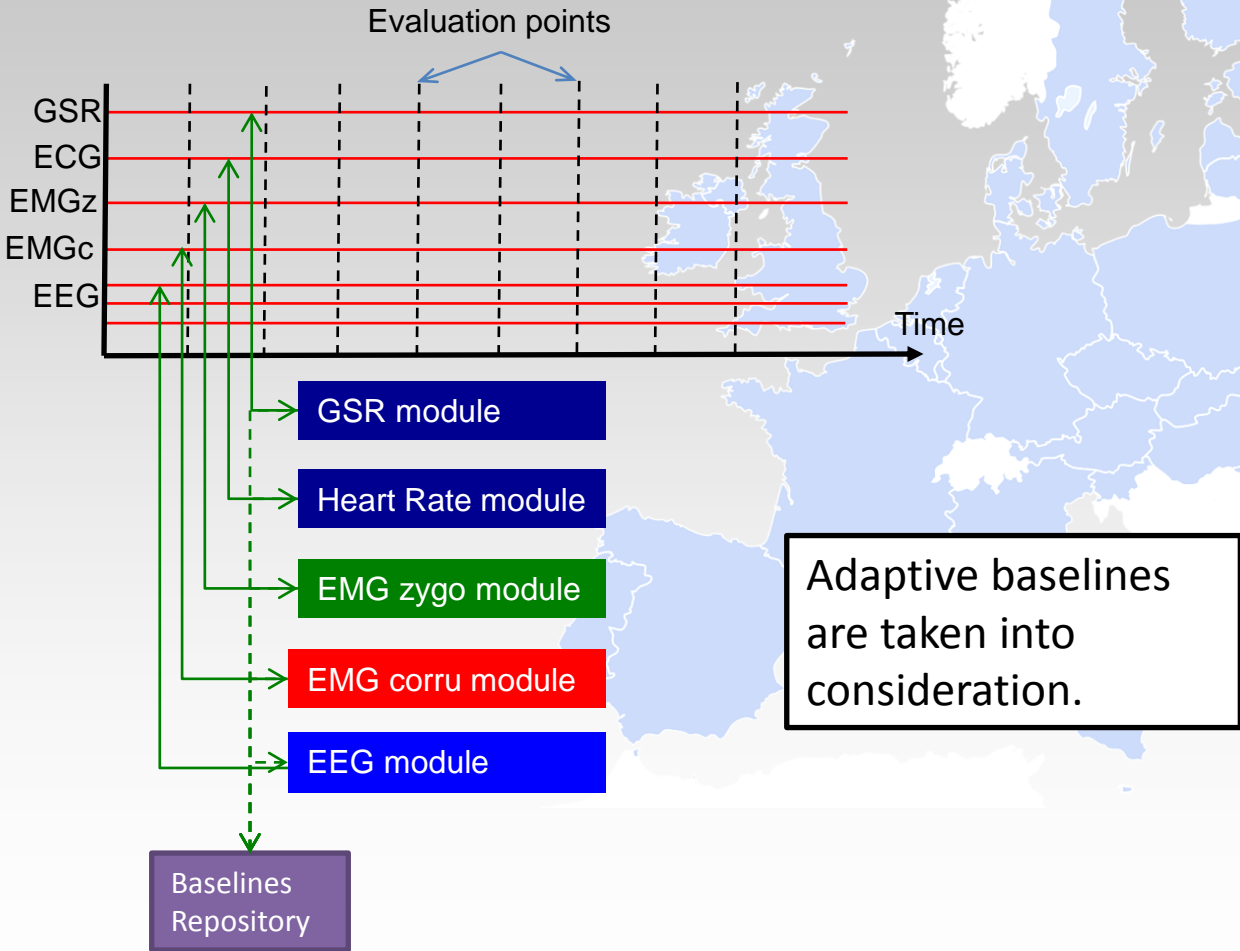
Biofeedback system (in progress)



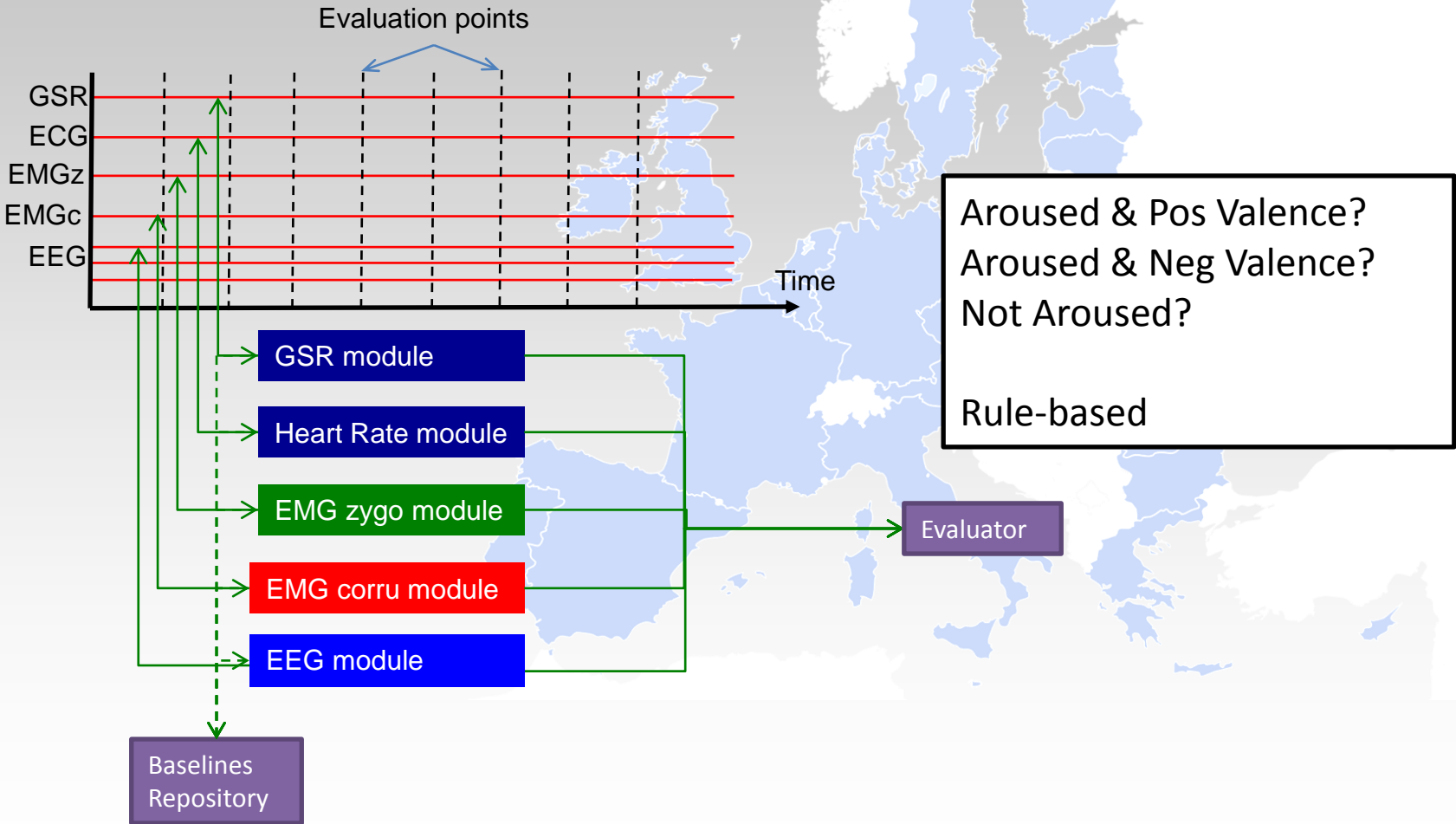
Signal features for last 15 sec window are fed to modules which can detect:

- Arousal
- Positive valence
- Negative valence
- Cognitive load

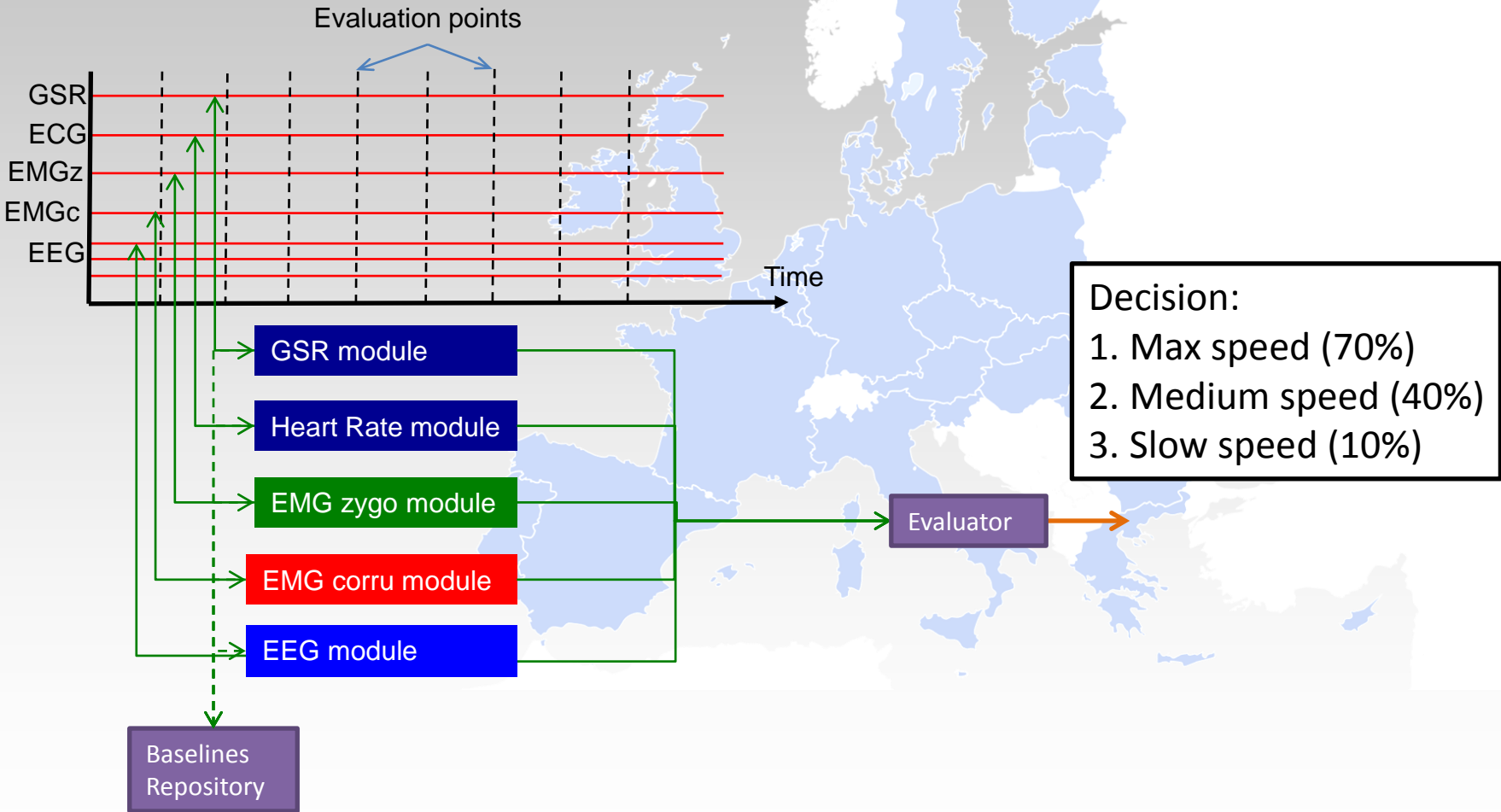
Biofeedback system (in progress)



Biofeedback system (in progress)



Biofeedback system (in progress)



Thanks for the attention!

PsyIntEC team

Dr. Johan Hagelbäck, project manager

Dr. Stefan Johansson, senior researcher

Prof. Craig Lindley, external adviser

Olle Hilborn, Ph.D. student

Petar Jercic, Ph.D. student

Wei Wen, Ph.D. student

Johan Svensson, lab engineer and developer



Blekinge Institute of Technology
Karlskrona, Sweden
www.bth.se/com/cogneuro