

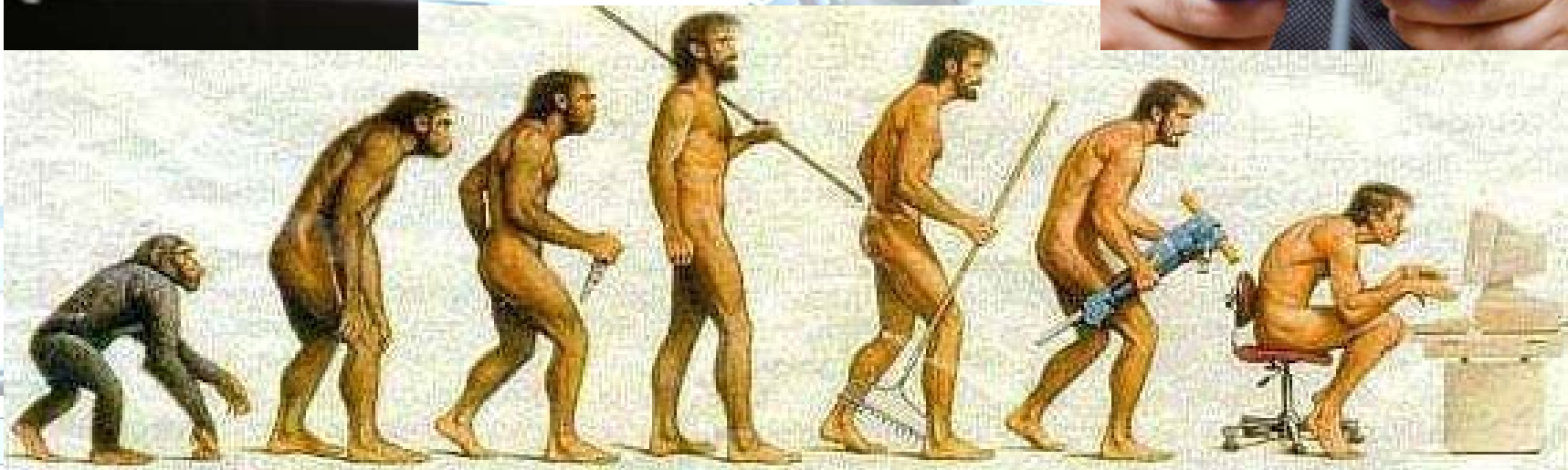
The Future of User Interfaces: Human-Behaviour-Centred Designs

Maja Pantic

Imperial College London

Computing Dept.

Humans & Computers: Present



Humans & Computers: Future



Humans & Computers: Present

Human-Human Interaction:



Simultaneous employment
of sight, sound and touch

Human-Computer Interaction:



keyboard



mouse



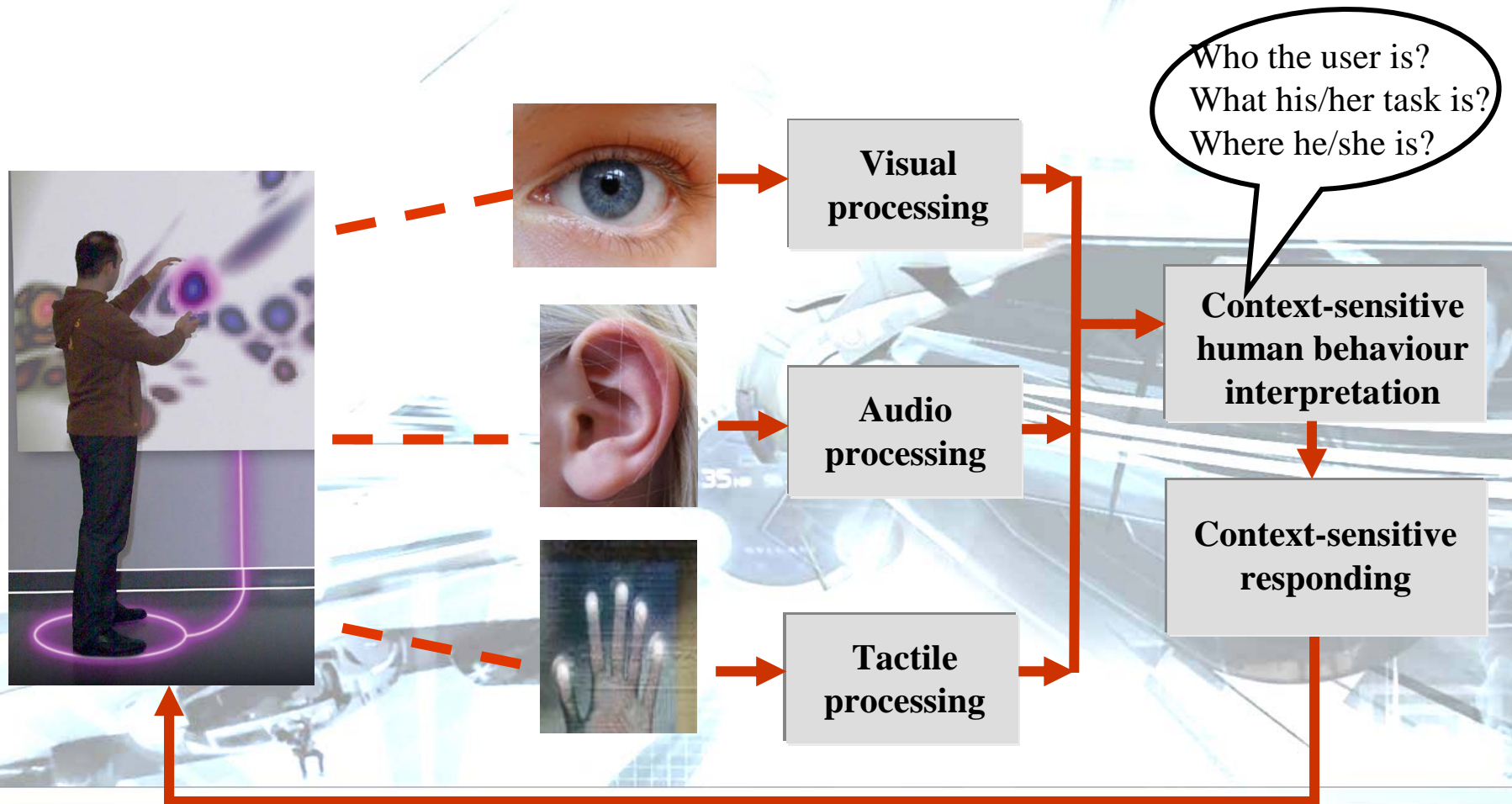
touch screen

joystick

**Direct
manipulation**

Current HCI-designs are single-
modal and context-insensitive

Computers – Future: Human-Centred Computing



Human Behaviour Understanding



➤ Messages:

- affect / attitude / cognitive states
 - manipulators
 - emblems
 - illustrators
 - regulators
- Social Signals*

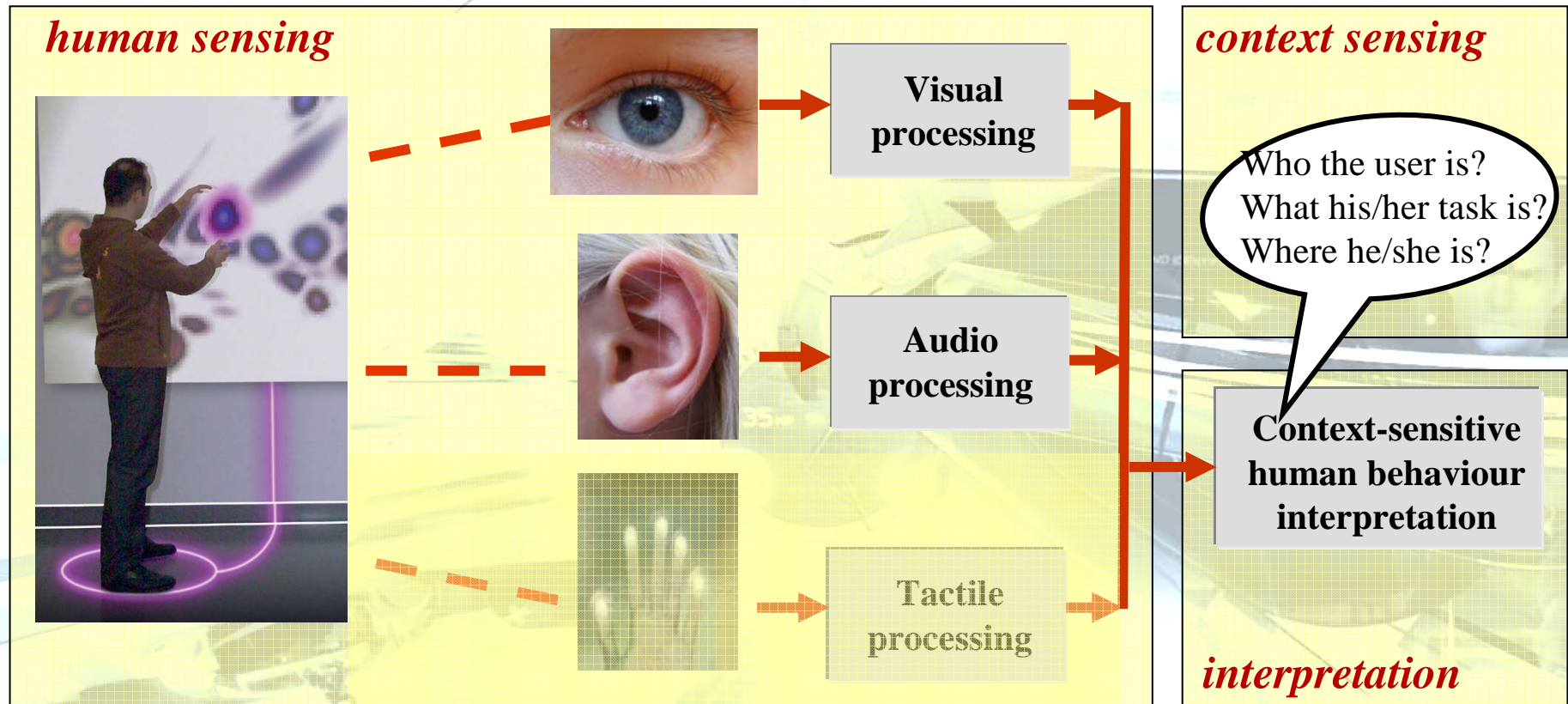
➤ Informative Modalities:

- visual (face, body-, hand gestures)
- auditory (speech, intonation, non-verbal vocalizations)
- tactile

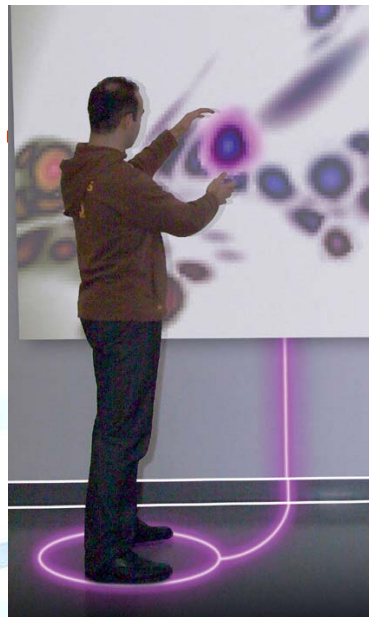
➤ Context Dependency:

- who? where? what? when? why?

Machine Understanding of Human Behaviour



Human Sensing



**Visual
processing**



detection, tracking, expression recognition



**Audio
processing**



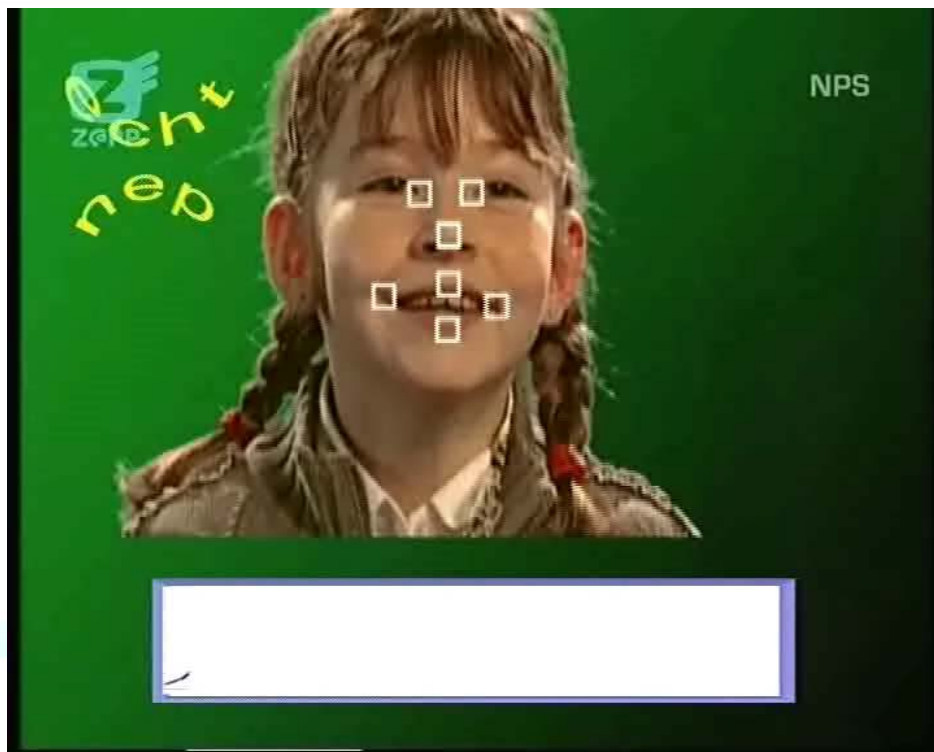
detection, tracking, gesture recognition

Vision based Human Sensing – Face



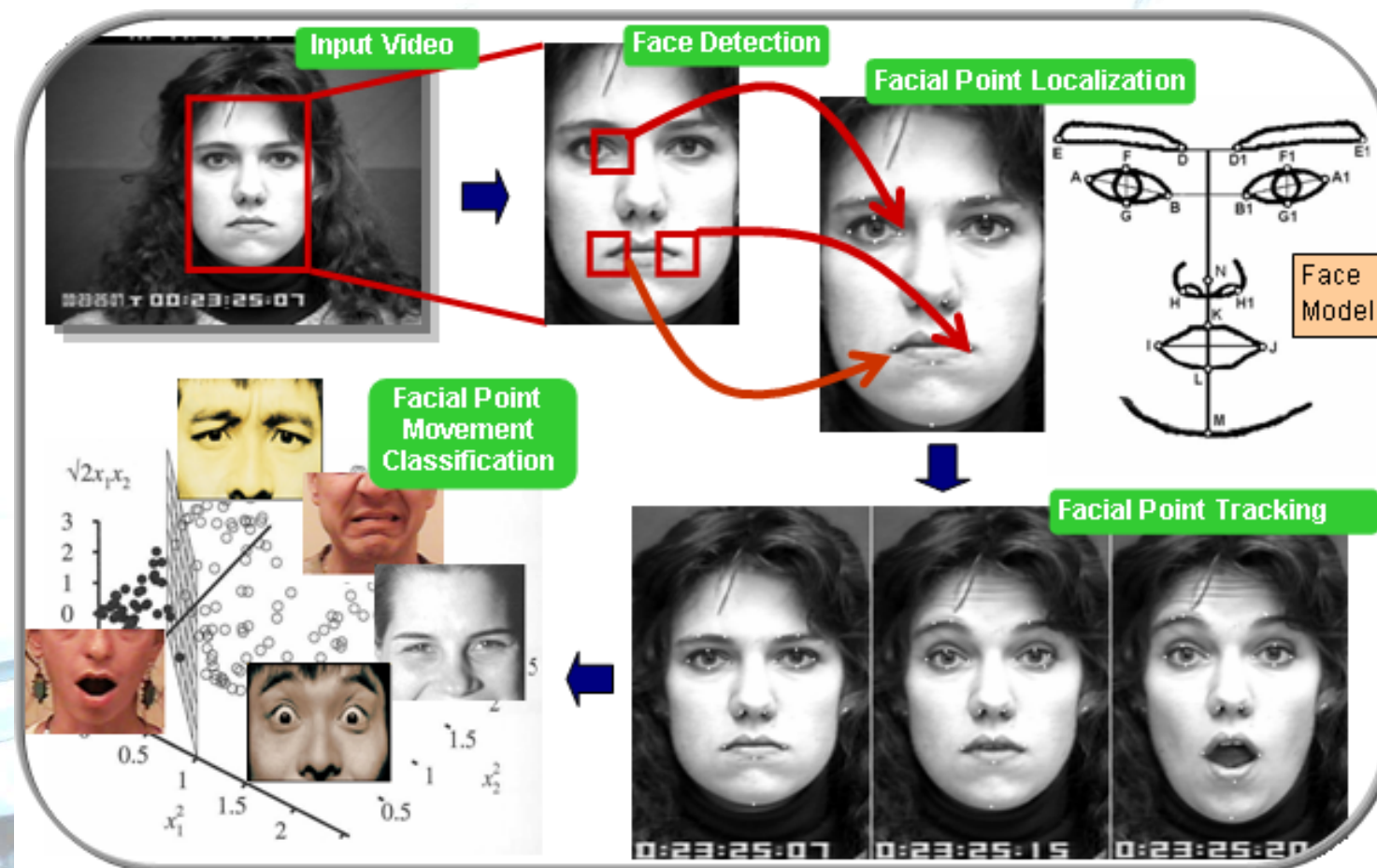
- Bibliography: Keith Price Bibliography (<http://iris.usc.edu/Vision-Notes/bibliography/>)
- Software: UCSD (mplab.ucsd.edu), CMU (www.ri.cmu.edu/labs/lab_51), ...
- Difficulties with: tilted faces, sudden movements, occlusions

Vision based Human Sensing – Face



- Methodology: optical flow, sequential state estimation (Kalman filtering, Particle filtering)
- Difficulties with: very fast movements, (self-) occlusions, unconstrained environments
- Bibliography: Haykin & Freitas (Eds., 2004), Pantic & Bartlett (2007)

Vision based Human Sensing – Facial Expression

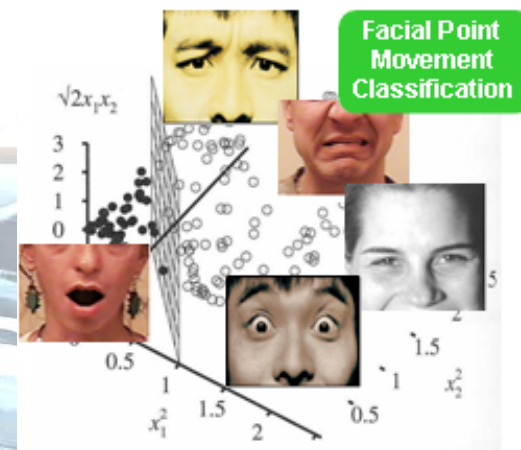


A feature-based facial expression analyzer

Vision based Human Sensing – Facial Expression



Anger Surprise Sadness Disgust Fear Happiness



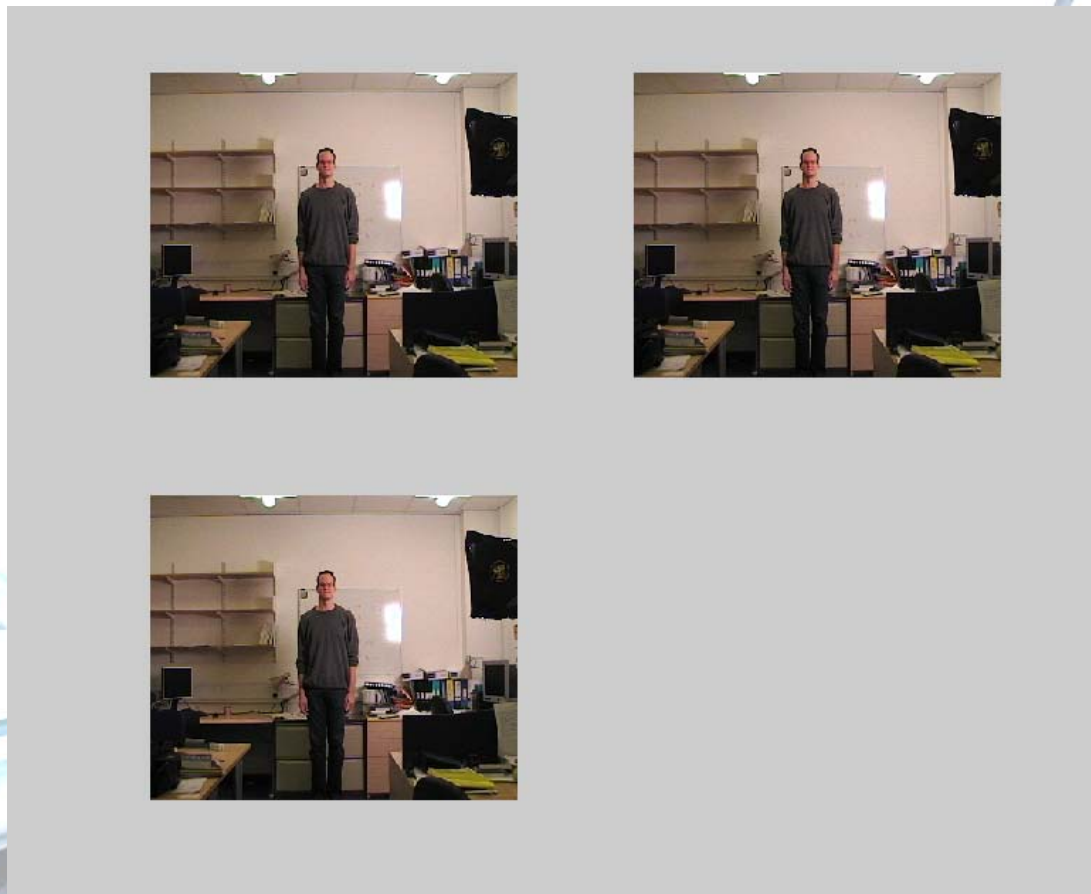
- Methodology: feature / appearance-based; Bayesian, statistical and ensemble learning
- Limited performance and robustness, disregarding temporal dynamics, posed data
- Bibliography: Tian et al. (2005), Pantic & Bartlett (2007), Zeng & Pantic & Huang (2008)

Vision based Human Sensing – Body



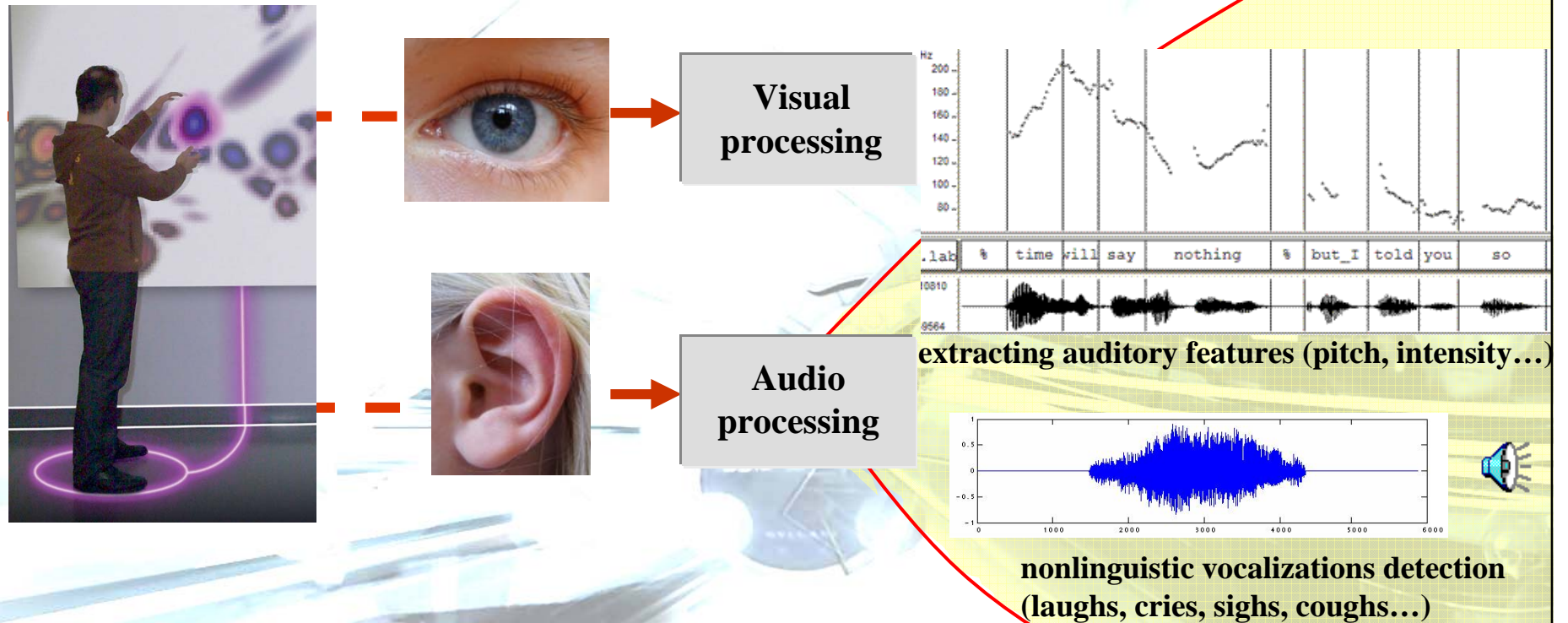
- Methodology: optical flow, sequential state estimation (Kalman filtering, Particle filtering)
- Difficulties with: very fast movements, (self-) occlusions, unconstrained environments
- Bibliography: Wang & Singh (2003), Haykin & Freitas (Eds., 2004), Poppe (2007)

Vision based Human Sensing – Body



- Methodology: model / appearance-based, probabilistic or statistical learning
- Limited performance and robustness, context insensitivity (Wang et al. 2003; Poppe, 2007)

Audio based Human Sensing



- Auditory features extraction software: Praat, Rasta
- Recent developments: attempts to automatically recognise nonlinguistic vocalizations
- Difficulties with: ambient noise, vocal outbursts detection in speech, naturalistic contexts

Human Behaviour Understanding



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➤ Informative Modalities:

- visual (face-, body-, hand gestures)
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- tactile

➤ Context Dependency:

- who? where? what? when? why?

Human Behaviour Understanding - Affect



Anger

Surprise

Sadness

Disgust

Fear

Happiness

- Six basic emotions: introduced by Charles Darwin (1872), elaborated by Ekman
- Methodology: single- or bi-modal, decision-level data fusion, supervised learning
- Limited performance and robustness, disregarding temporal dynamics, posed data
- Bibliography: Pantic & Rothkrantz (2003), Zeng & Pantic & Huang (2008)

Human Behaviour Understanding - Affect



Person-dependent display of anger

Spontaneous vs. Posed

- Recent developments: attempts to automatically recognise non-basic emotions (fatigue, pain), to learn user-profiled interpretations, to discern spontaneous from posed (Zeng et al., 2008)

Human Behaviour Understanding – Social Signals



- Pentland (MIT): tone of voice → activity level, stress, engagement, mirroring
- Gatica Perez (IDIAP): voice, hand, head movements → level of interest
- El Kaliouby (MIT): facial and head gestures → (dis)agreement, level of interest
- Very limited performance and robustness

Human Behaviour Understanding



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➤ Informative Modalities:

- visual (face-, body-, hand gestures)
- auditory (intonation, non-verbal vocalizations)

➤ Context & Dynamics:

- ✗ who? where? what? when? why?
- ✗ temporal analysis
- ✗ context-sensitive multimodal fusion

Human Behaviour Understanding – Challenges

- **Scientific:**

- **Multimodality:** Which modalities? Fusion level?
- **Fusion & Dynamics:** Fusion and temporal correlations within and between modalities?
- **Fusion & Context:** Context-dependent fusion and discordance handling?
- **Learning vs. Education:** Lazy and unsupervised learning?

- **Technical:**

- Initialisation
- Robustness
- Speed
- Training & Validation Issues