

# How to build a machine that people enjoy talking to

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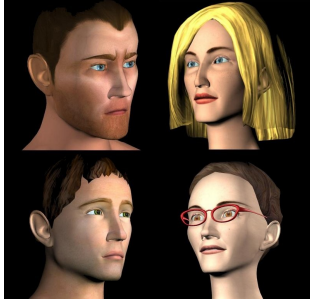
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## Sensitive Artificial Listeners...

aggressive  
Spike



cheerful  
Poppy

gloomy  
Obadiah

pragmatic  
Prudence

... chatting with a user:



## Outline

Talking to existing dialogue systems doesn't "feel" natural because today's machines lack the "soft skills" needed to maintain a conversation.

### Research question:

What does it take for a dialogue with an artificial agent to "feel" like a real conversation?

### Method:

- 1) Study human-to-human conversations
- 2) Implement key non-verbal capabilities in a real-time multimodal interactive system
- 3) Test which system configurations "work"

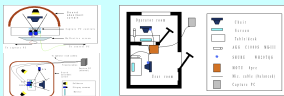
### Scenario:

Sensitive Artificial Listeners make the user talk and, through their reactions, try to induce a certain emotion in the user. They have good non-verbal but very limited verbal skills.

## Data collection & annotation

How do humans maintain a conversation?

- very careful high-quality recording setup
- multiple cameras and microphones recorded in sync



### Solid SAL

human-to-human conversation in the SAL scenario (human operator pretends to be SAL)

- covers both speaker and listener behaviour
- 20 subjects, 15:20 hours
- rich annotations of emotion, epistemic states, interaction
- available for research from [semaine-db.eu](http://semaine-db.eu)

### Wizard-of-Oz SAL

- operator selects SAL agent responses
- data closer to fully automatic system, including failures
- recordings ongoing

## System building

SEMAINE system integrates components for

- detecting emotions, interest, gender etc. from the voice
- detecting faces, nods/shakes, emotions from the face
- interpreting analysed information into a user state model
- determining what to say and what listener behaviour to show
- synthesising expressive speech and non-verbal vocalisations
- generating expressive 3d head and face animations

Distributed component integration framework

- based on Message-oriented middleware ActiveMQ
- standard W3C interface formats: SSML, EMMA, ...
- Java/C++; Windows, Linux, Mac OS X

Iterative cycle of improving and tuning:

- initially train analysis components on preliminary data, formulate interpretation and generation rules intuitively
- as data is becoming available, retrain and update rules

System is publicly available

- most components open source
- download from [www.semaine-project.eu](http://www.semaine-project.eu)

## System evaluation

Identify determinants of a successful interaction in the SAL scenario

- test Wizard-of-Oz and automatic human-machine dialogues
- give human operators limited information to provoke failures
- no speech, filtered speech, full speech setups: how important is the prosody vs. verbal content?

Develop measures of conversation breakdown

- give users a "yuk" button they can press when the conversation feels anomalous
- include "integrated evaluations" into the setup, where users are queried about the quality of interaction within the system
- annotation of interaction breakdown in recorded dialogues
- relate these to objective measures: learn to identify situations of conversation breakdown to trigger repair strategies

## Future plans

Sensitive Artificial Listeners have the potential to become "experts" of a user's characteristics

- the meaning of a given user's non-verbal expressions
- their enduring preferences

To be able to do that, SALs will need memory and adaptation+learning capabilities

Their expertise can potentially make human-machine interaction more robust and natural in a broad range of multimodal interaction scenarios