

### Models of Anticipatory Thinking

Nele Russwinkel



Chair of Cognitive Modelling in dynamic Human-Machine Systems

Technische Universität Berlin



www.kmodys.tu-berlin.de

### WHERE ARE THE INTELLIGENT INTERACTING PARTNERS?



## CHALLENGES OF HUMAN AWARE AI (KAMBHAMPATI, 2012)

- Human-Aware AI Systems goal-directed autonomous systems that are capable of effectively interacting, collaborating, and teaming with humans.
- Challenges in designing such human-aware AI systems, include
  - modeling the mental states of humans-in-the-loop and
  - Recognizing their desires and intentions,
  - providing proactive support,
  - Exhibiting explicable behavior,
  - giving cogent explanations on demand, and
  - Engendering trust.



### WHAT CAN COGNITIVE MODELLING DO FOR INTELLIGENT SYSTEMS?

"What can cognitive architectures do for robotics? "(Kurup & Lebiere, 2012)

- 1. Represent, Integrate and Use Large Amounts of Knowledge
- 2. Learning and Recognizing Instances of Known or Familiar Patterns
- Problem Solving & Reasoning Not all situations are familiar or similar enough to previous situations to directly benefit from previous episodes.
- Flexible, Adaptive, Dynamic, and Real-time Behavior Robust real-world behavior cannot be pre-programmed. It requires flexibility.
- 5. Interact with Humans in a Natural Way



## ANTICIPATORY THINKING (GARRY KLEIN ET AL., 2007)

- Anticipatory thinking is a critical <u>macrocognitive function</u> of individuals and teams.
- It is the ability to prepare in time for problems and opportunities.
- Distinguishes from prediction because anticipatory thinking is functional—people are preparing themselves for future events, not simply predicting what might happen.
- It is aimed at potential events including low-probability high threat events, not simply the most predictable events.
- Anticipatory thinking includes <u>active attention management</u> focusing attention on likely sources of critical information.



# MODELS OF ANTICIPATORY THINKING

- It's not a model how a person works on a task. It is the ability to anticipate another person working on a task.
- Reduce to the max: What are the most relevant information sources to identify e.g. a dangerous situation?
- Tracing the human partner in the task (only relevant parts)
- What details are less relevant?
- Flexibility to adapt to situation development



### EXAMPLES

- In interactive situations, additional information is provided through actions of the partner, feedback, expressions of mental state (facial expressions, EEG, Heartrate, careful or less carful decisions, a.s.o), these can be used to confirm or reject assumption about the hypothesized cognitive state of the partner.
- I. Neuro Cognitive Assistance (Klaproth et al., 2019)
- 2. "Integrated models of cognitive and physical human-robot interaction"
  - What is anticipated?
  - What is the focus of the model?
  - What is the simplest way to approach this?
  - What details are not part of the model?

### Cognitive Models for Intelligent Interfaces in the Cockpit



Further cooperation partners:

Prof. Thorsten Zander (Brandenburg University of Technology) Laurenz Kroll (TU Berlin)

Christoph Vernaleken & Inge Wenzel (Airbus)









### AIRBUS CR&T

### Oliver Klaproth

Klaproth, O.W., Halbrügge, M., Krol, L.R., Vernaleken, C., Zander, T.O., & Russwinkel, N. (2020), A Neuroadaptive Cognitive Model for Dealing With Uncertainty in Tracing Pilots' Cognitive State. Topics in Cognitive Science, 12(3), 1012-1029. doi:10.1111/tops.12515

Klaproth, O.W., Vernaleken, C., Krol, L.R., Halbrügge, M., Zander, T.O., & Russwinkel, N. (2020). Tracing Pilots' Situation Assessment by Neuroadaptive Cognitive Modeling, Frontiers in Neuroscience, 10.3389/fnins.2020.00795, 14, (2020).

### **COMPLEX HUMAN MACHINE INTERACTION**



The largest proportion of pilot errors is due to incorrect perception (70.3%) and understanding of the situation (20.3%) (Jones & Endsley, 1996).



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263	13,1083	2017-12-06T08:55:11	0.925780118	0.854083354	0.9216	200	25500	348	296.920319	24396.68597	TRUE	FALSE
264	13,1583	2017-12-06108-55-11	0.925780118	0.854683354	0.9510	200	25500	348	297.084901	24391.02902	TRUE	FALSE
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267	13.3083	2017-12-06T08 55 11	0.925780118	0.854683354	0.9216	293	25600	348	297.576141	24374.08174	TRUE	FALSE
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201	13,4083	2017-12-06T08:55:11	0.925780118	0.854083354	0.9216	200	25/500	348	297.902435	24362.00618	TRUE	FALSE
270	13,4583	2017-12-06T08:55-12	0.925780118	0.854683354	0.9216	200	25500	348	298.054789	24357,1732	TRUE	FALSE
271	13.5083	2017-12-06T08 55 12	0.925780118	0.854680354	0.9216	280	25500	1 348	298 227051	24351 54115	TRUE	FALSE
272	13.5583	2017-12-06T08 55 12	0.925780118	0.854083354	0.9216	200	25600	348	298.388794	24345.91704	TRUE	FALSE
273	13.6063	2017-12-06T08 55.12	0.925780118	0.854683354	0.9216	260	25600	348	298.650478	24340.29447	TRUE	FALSE
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### Epistemic uncertainty

## DATA SOURCES

The model is based on task analysis an integrated information out of cockpit protocols.... and EEG Data of the pilot

21 Vps ~18 min Scenario incl. ~10-14 acustic warnings

Experimental cockpit simulator (A320-like)

Cockpit instrument logs recorded with 20hz



### COGNITIVE PILOT MODEL



### COGNITIVE PILOT MODEL

### INTEGRATED MODELS OF COGNITIVE AND PHYSICAL HUMAN-ROBOT INTERACTION

Philipp Beckerle & Stella Hao Chenxu (Uni Erlangen-Nürnberg), Nele Rußwinkel (TU Berlin), Daniel Häufle (Uni Tübingen)



Requirements of the cognitive Model:

- Understands the task, and next steps in the task (also flexible parts of the task)
- Traces situation awareness (what information gathered so far, interpretation, where in the task, what will happen next?)
- Understand context information (beer in the glass → heavy, steak needs to be fixed for cutting, fries are light and move a lot → short picking movements necessary)
- What is that state of the Human strong tremor, well coping, ...

### INTEGRATED MODELS OF COGNITIVE AND PHYSICAL HUMAN-ROBOT INTERACTION



- Needed: Approach that integrates higher cognitive level with sensorimotor control. (Kahl et al., 2021)
- Different levels of support place different requirements on the anticipatory model.
- Joint action?
- Vision: Both sides are adaptive to one another

[4 Kahl, S., Wiese, S., Russwinkel, N., & Kopp, S. (2021). Towards autonomous artificial agents with an active self: modeling sense of control in situated action. Cognitive Systems Research, 72, 50-62. https://doi.org/10.1016/j.cogsys.2021.11.005

### CHALLENGES

- Connecting further models/simulator/sources of information to the cognitive Model.
- Integrating information considering reliability of information and uncertainty
- How can such models be evaluated if every individual anticipatory thinking model will develop individually?
- What cognitive principles are most relevant for "Anticipatory Thinking" approaches?

### SUMMARY

- Models of Anticipatory Thinking are NOT models of the cognitive processes of someone engaged in a task!
- RATHER: Captures how another agent anticipates a partner.
- Anticipation can be about anticipating the partner (just observing and understanding), and
  offering support (e.g. force applied by robot), or anticipating own actions and trying to cope
  with environmental changes or other processes.





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# THANK YOU FOR YOUR ATTENTION!