R&D&I IN DIAGNOSIS AND THERAPY: LESSONS FROM THREE CASES

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The three cases

- 1. Intelligent assistant for *physical rehabilitation*
- 2. Machine help for *autism diagnosis and therapy*
- 3. Machine assistant in cognitive behavioral therapy *for PTSD*

First, I will talk about the needs of these tasks and then the three cases



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General needs

The machine

- should know about the environment and
- follow and help the execution of the task,
- detect manipulation and patient's movement,

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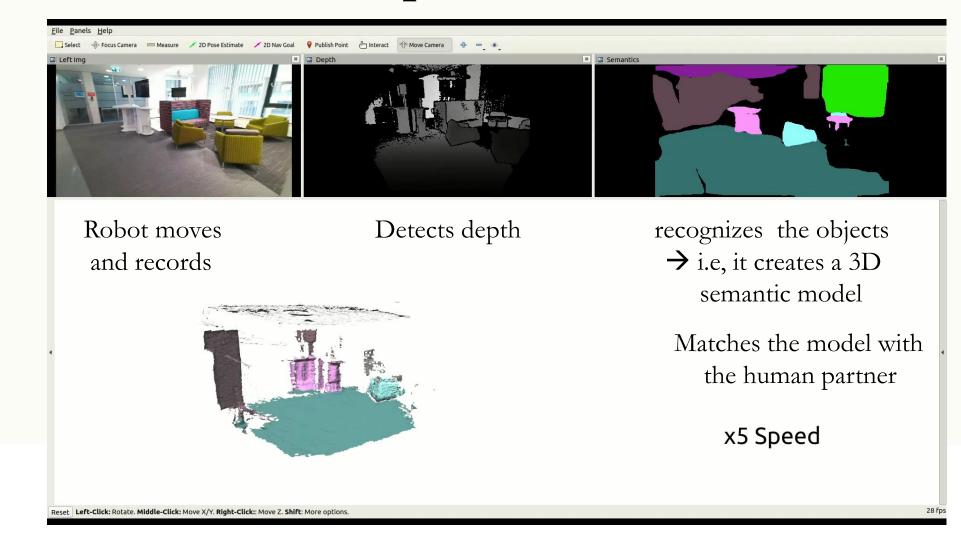
- should know about the mood, emotions, and personality, and
- should optimize the collaboration,
- and thus, verbal communication during task execution is a must

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Environment \Rightarrow Semantic Map \Rightarrow Verbal Interaction



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3D Semantic Label Transfer in Human-Robot Collaboration. In Proceedings of the IEEE/CVF International Conference on Computer Vision, pp. 2602-2611. 2021.

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3D Semantic Label Transfer and Matching in Human-Robot Collaboration - submitted

Semantic Map can be used in different ways



- Robot can talk about partner's body relative to the objects, and directions in:
 - a. the patient's ego-centric coordinate system – e.g., for guidance and motion error correction
 - b. top-down view for path planning



Components for characterizing patient's state

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We are combining the following tools

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- Body part detection and motion estimation
 - full body, head, hand,
 - object in hand $\leftarrow \rightarrow$ detecting manipulation,
 - eyes, blinking
 - $gaze \leftarrow \rightarrow$ estimating intention
- Behavior estimation
 - emotion
- Software tools
 - tracking
 - information fusion using deep transformer networks
 - deep neural networks and Composite AI

Personality for optimizing collaboration?

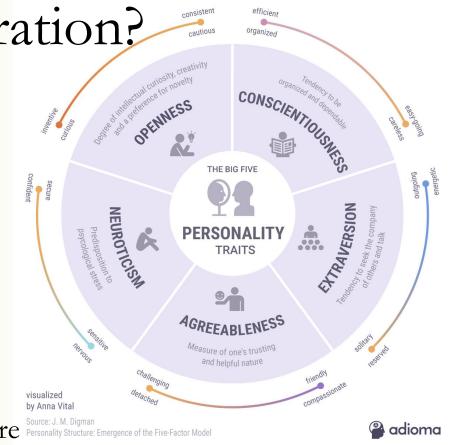
Many different measures

- *Big-five* is the most popular:
 - Openness
 - Conscientiousness
 - Extraversion
 - Agreeableness
 - Neuroticism (opposite of Emotional Stability) OCEAN

Method: Self-assessment. For example: BFI-10 – 10-item questionnaire Source: J. M. Digman Personality Structure: Emergence of the Five-Factor Model

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- Self-assessment may change but it is a slow process.
- But during interactions:
 - OCEAN parameters may change by quickly
 - Actual personality influences the interaction



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Barcelona group:

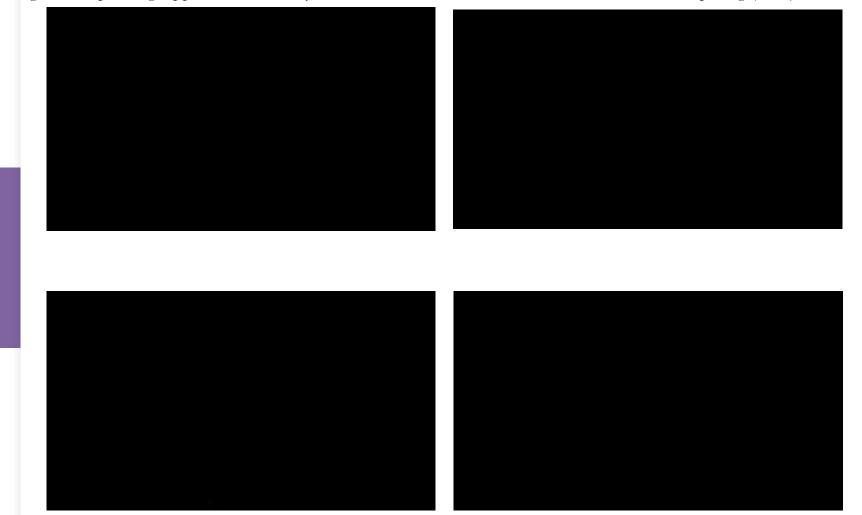
The ChaLearn Database

15s vlogs more than 10,000 with relative OCEAN scores using Amazon Turk

We trained a deep transformer-based fusion architecture with 10,000 vlogs.

We have 15s estimations

Escalante, H. J.; Kaya, H.; Salah, A. A.; Escalera, S.; Gucluturk, Y.; Guclu, U.; Baró, X.; Guyon, I.; Jacques Junior, J. C. S.; Madadi, M.; Ayache, S.; Viegas, E.; Gurpinar, F.; Wicaksana, A.S.; Liem, C.C.S.; van Gerven, M. A. J.; van Lier, R. "Modeling, Recognizing, and Explaining Apparent Personality from Videos," IEEE Transactions on Affective Computing (TAC), 2020.



"Multimodal Sentiment and Personality Perception Under Speech: A Comparison of Transformer-based Architectures." In Understanding Social Behavior in Dyadic and Small Group Interactions, pp. 218-241. PMLR, 2022.

Perceived personalities

Perceived personality may differ

- in different groups
- as a function of the task performed
- We worked with different databases (ELEA, UDIVA, AMI, Multisimo)
- I show results on two *meta traits*
 - *Stability* (Agreeableness + Conscientiousness + (Emotional Stability))
 - *Plasticity* (Extraversion + Openness)

ELEA =: Emergent LEader Anal-ysis

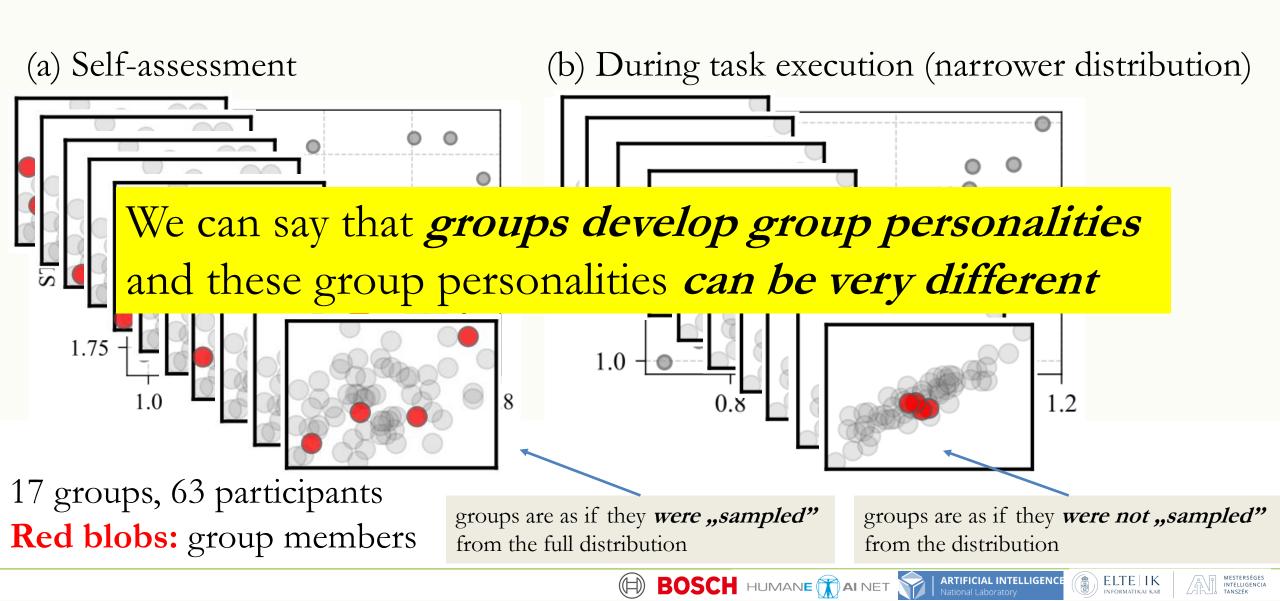
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Example: the ELEA database



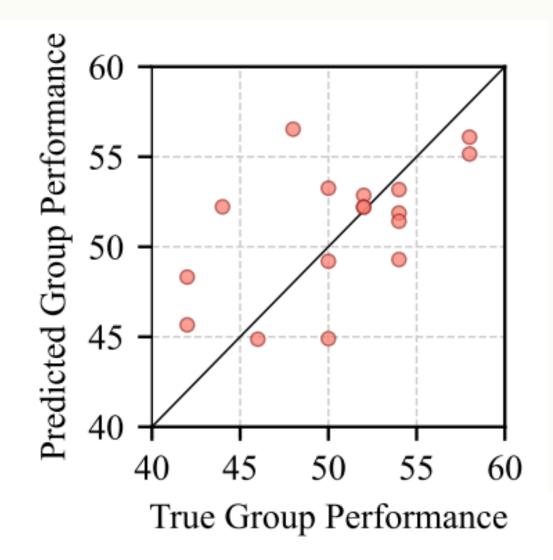
Performance

Prediction of group performance is possible

• The same prediction does not work for group affect estimations

OUTLOOK

• Personality estimation may help improve performance during patient-avatar dyadic interaction by *modulating the* personality of the avatar partner



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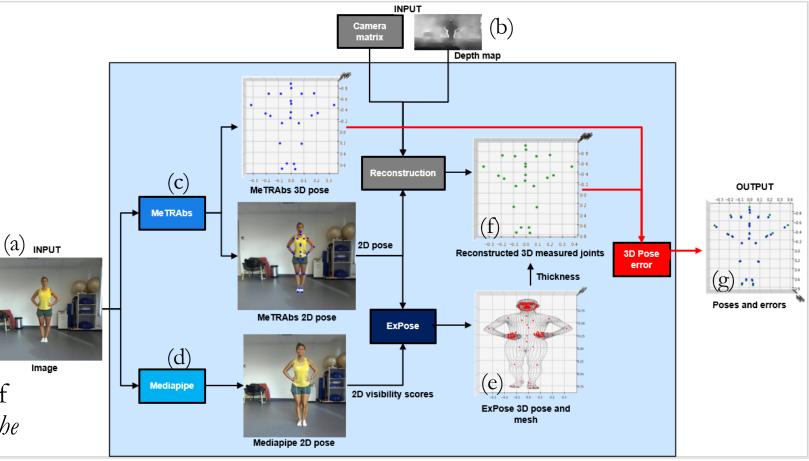
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APPLICATIONS



Physical rehabilitation ⇒ Human body pose estimation

- Precise pose estimation and error minimization
 - with 2D cameras
- Software tools
 - MeTRAbs software
 - MediaPipe software
 - ExPose for avatar model
 - New transformer models
- Result:
 - Precise (2-4 cm) pose estimation if *patient is guided to the right place and the direction is right*



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Physical rehabilitation: \Rightarrow Full architecture (only the components are ready)

- Video recording of the expert results in avatar-based demonstration that can be viewed from different angles
- Patient's avatar model for the optimization of positions and directions (camera and patient) within the map
- Dialogue for guiding navigation, explaining errors, and offering pre-recorded suggestions for error correction

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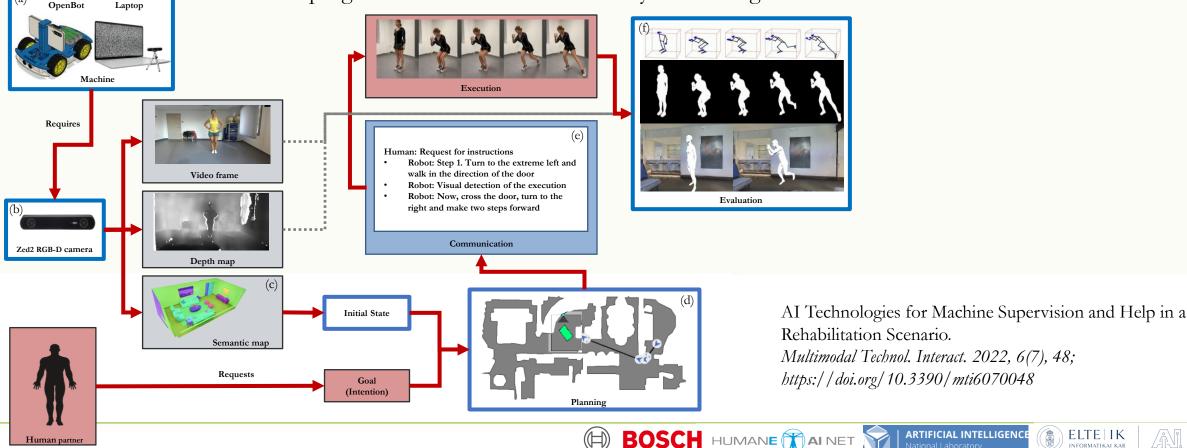
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Patients' progress can be recorded and anonymized using their avatars and virtual environments.



Manipulation/activities

What is s/he doing? What is her/his mood? What is s/he up to?

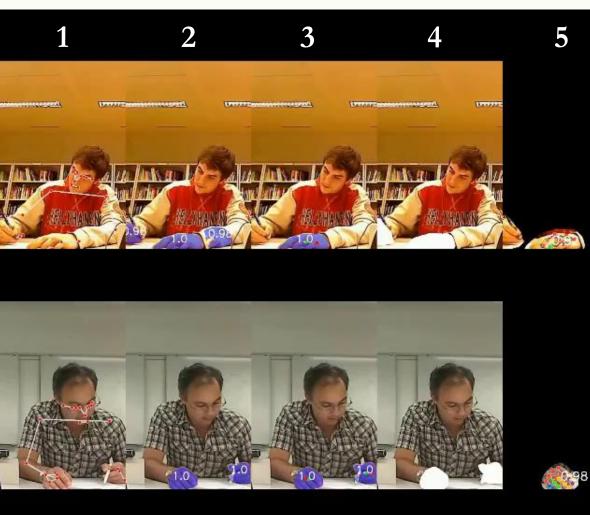
Is help needed?

How could the machine help?

Composite AI combines deep networks

- 1. 3D upper body (including wrist and hand) estimation from 2D camera using MediaPipe
- 2. Hand detector trained with tracked samples
- 3. Hands detected by MediaPipe and hand detector must "agree"
- 4. Tracking based improvements if they don't
- 5. 3D hand configuration estimation

Manipulation and interaction – healthy children







PTSD, depression, anxiety – under construction

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- Cognitive behavioral therapy uses homeworks, like
 - writing a diary,
 - doing *thought recording* with Socratic-Questioning Technique
- However, *adherence* to the homeworks is
 - critical as they are useful
 - for the documentation of the success of the therapy and
 - enable high-quality cross-border follow ups.
- We are about to use techniques *known to improve adherence* to homeworks
 - dialogues with *paraphrasing* and *clarifying questions*
 - modulating *avatar* reactions according to content
- Under construction

TRL and Market for the three cases

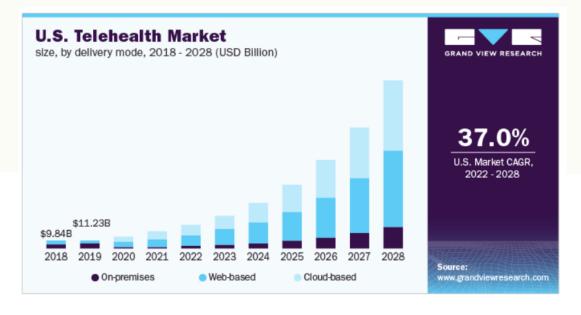
- Autism: startup is entering Series A financing stage
- Physical Rehabilitation: ready for launching a startup no plan yet
- PTSD, depression, anxiety R&D&I project is under construction

Demand for Global Mental Health Software Market Size Will

- hit USD 5,7 Billion by 2028,
- Exhibit a CAGR (Compound annual growth rate) of 18.50%



Global Home Rehabilitation Market \$225 Billion by 2027 October 20, 2021 by <u>iHealthcareAnalyst</u>, Inc.



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Our partners:

<u>Autism</u>

- USA: Autism Center, Rush Medical School, Chicago
- USA: Argus Cognitive, Inc.

Phyical rehabilitation

- Hungary: Emineo Clinic, Budapest Therapy after total knee/hip replacements
- Czechia: Charles University, Prague NLP

Personality estimation

- Spain: Barcelona University
- The Netherlands: Delft Technical University Covid-19 study

Avatar animation/design and smart environment

- **Germany:** DFKI (German Research Center for Artificial Intelligence) <u>PTSD - under construction</u>
- Ukraine: National Technical University, Kharkiv
- **USA:** Veteran Center, Rush Medical School, Chicago Zoom recordings National Laboratory of Artificial Intelligence, Hungary
- Main Hungarian universities, research centers, and governmental units *EU project: HumanE-AI*
- 53 partners on Human-Centered AI from basic science to prototypes



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Lessons

- These are complex tasks that require:
- AI experts \rightarrow Composite AI methodology
 - including speech processing, video processing, rule-constrained chatbots, and avatar animation designers
- psychologists, psychiatrists
- physiotherapists
- experts on the fields of
 - medical psychology
 - medical sociology
- legal partners, including experts on privacy, human rights, GDPR, and ethical issues
- high-tech naturalistic environments for testing among others



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Photos are *from our partner*. Interactive Machine Learning Lab DFKI – Saarbrücken and Oldenburg

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https://nipg.inf.elte.hu/ https://iai.inf.elte.hu/ https://www.elte.hu









attention!

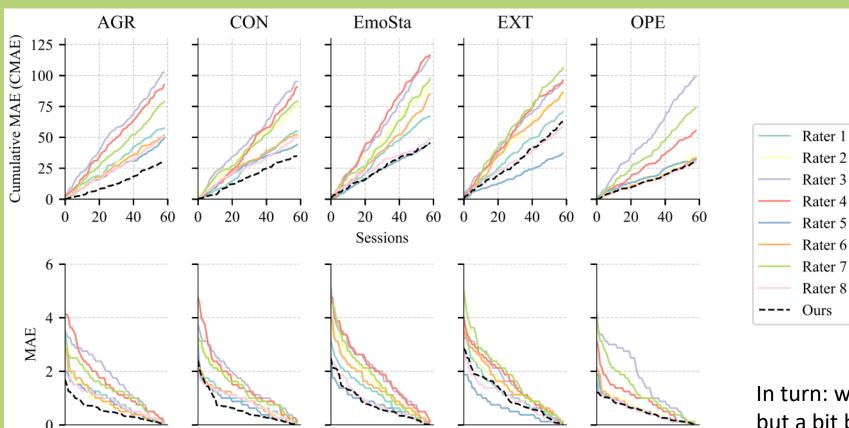


ADDITIONAL SLIDES



What we measure (submitted – don not quote it yet..)

- Fortunate situation: Database Multisimo
- It has: 8 raters estimate perceived personalities over 15s videos on 59 time segments



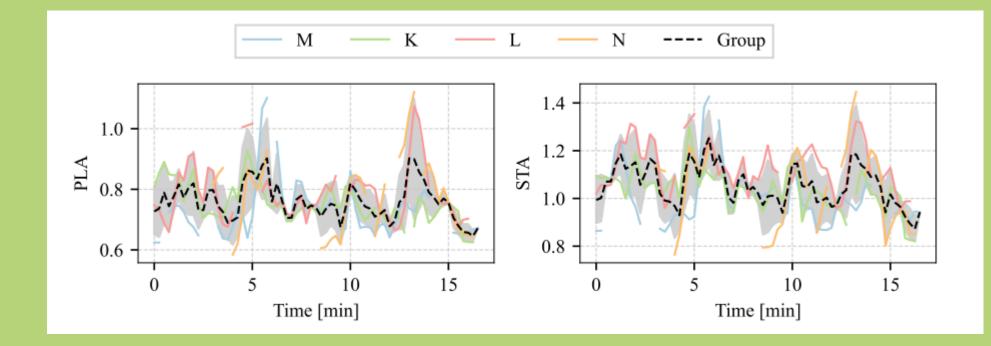
Rater error from the average first impression score for the raw big-five traits.

- Top row: Cumulative mean absolute error (CMAE) of the human raters and the mapped transformer rating.
- Bottom row: Mean absolute error for human raters and the mapped transformer rating. MAE shown in descending order

In turn: we are measuring what human raters do, but a bit better than the majority of the human

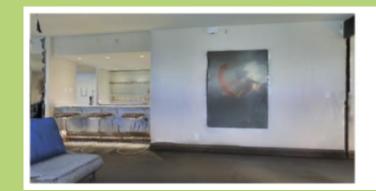
Can we predict performance?

- There is a temporal dependence
 - Groups change over time
 - They tend to move together, or come together from time-to-time



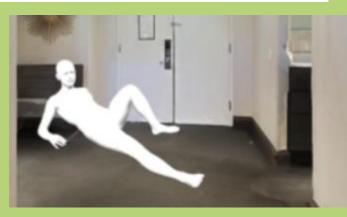
Rehabilitation scenario

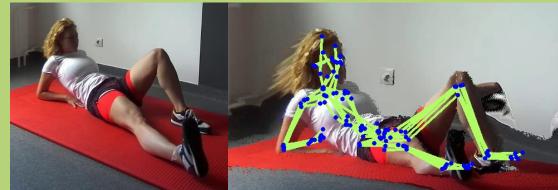
- Deep deep network's outputs
 - Should be non-foolable
 - Should provide explanations
 - Networks that develop dictionaries (sparse coding networks) are promising
- Real time solutions
- Verbal interaction environmental intelligence can help, controls and may provide instructions
 - joint cognitive space "semantic map"
- Complexity of the full software is large



Where to? What trajectory? Where to put the camera? What to execute? What was the error? How to correct the error? Problems with 2D cameras







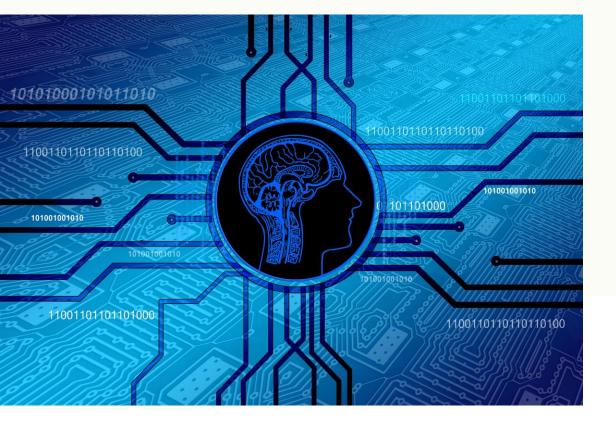


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Department of Artificial Intelligence Eötvös Loránd University (ELTE) Budapest, Hungary

ELTE's Department of Artificial Intelligence Founded on May 9th 2022

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Al research found for industrial collaboration 155 000 EUR / year 2020 - 2022



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We work on human-centered Artificial Intelligence (AI). On a trustworthy, ethical technology that enhances human capabilities. Our mission is to empower citizens and society to benefit from the AI revolution we are undergoing and to avoid the challenges of our age.

Our aim is to build a Department that is listed among the bests in Europe and is the number one in Hungary in Computational Intelligence and Composite AI. To this end, we work with a diverse set of technologies, like Deep Learning Evolutionary Technologies, Embodied and Societal Intelligence.



ELTE's Department of Artificial Intelligence

Total number of involved students in 2022 to the R&D activities of the AI Department

BSc

PhD

■ MSc DS

MSc AI
MSc AUS

MScHUN

PhD student

Assistant Research Fellow

9

AI Department Staff,

2022

8

Senior Research Fellow

Dept. Administrator

Research Fellow



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Brief history of ELTE

