

Information and Networking Event Horizon Europe 2023-2024 Calls Co-Funded by the Government of India (DST)



### HORIZON-CL4-2024-HUMAN-03-02: Explainable and Robust AI 24 May 2024

- Explainable Machine Learning based on Causality, Similarity and Perceptual Features
- Dimitris lakovidis, Professor
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### Meet our Team



#### Prof. Dimitris K. lakovidis [cv]

Intelligent signal processing & medical decision support systems

#### Faculty - Internal



Prof. Konstantinos Delibasis [cv] Medical informatics & image analysis



Prof. Michalis A. Savelonas [cv] Expert systems & pattern recognition



Prof. Panagiotis Vartholomeos [cv] Robotics

#### **Supporting Personnel**



Ms. Penny Athanasiou Project administration





Dr. Dimitris Diamantis [cv] Deep learning

Mr. George Dimas [cv] Computer vision & visual measurements

Dr In

Dr. Panagiotis Kalozoumis [cv] In silico modeling, finite element analysis & simulation

Dr. Dimitra-Christina Koutsiou [cv] Color imaging & physics-inspired algorithms



Dr. Argyris Stasinakis [<u>cv</u>] Optical communications

Dr. Michalis Vasilakakis [cv] Data analysis for information extraction

#### **Doctoral Researchers**



Ms. Eirini Cholopoulou [cv] Interpretable machine learning & computational modeling



Ms. Panagiota Gatoula [cv] Machine learning & multimodal data processing



Ms. Georgia Sovatzidi [cv] Evolutionary algorithms & bio-inspired optimization



Mr. George Triantafyllou [Cv] Computational modeling of complex systems using machine learning





## Facts about our Laboratory

- Belongs to the Department of Computer Science & Biomedical Informatics of the University of Thessaly, ranked among the top 5% of Universities in EU
- > 400 publications, 2 patents pending
- <u>10 recently published papers</u> on explainable machine learning (2022-2024):
  - Novel generic inherently interpretable systems that can render current machine learning systems interpretable
  - Uncertainty tolerant using linguistic data interpretations based on fuzzy logic
  - Explanations based on causality, similarity and perceptual features
  - Suitable for both **structured** (tabular) and **unstructured data**, including signals and images.
- 5 Recently funded HORIZON EUROPE projects (2022-2024)
  - SEARCH: Synthetic Health Data Governance Hub; IHI; 2025-2028; €15.266.705 (accepted)
  - INTELLI-INGEST: Intelligent Ingestible Devices; MSCE-DN; 2025-2028; €3.610.022 (accepted)
  - SOFTREACH: Minimally-Invasive Soft-Robot-Assisted Deep-Brain Localized Therapeutics Delivery for Neurological Disorders; PATHFINDER; 2023-2026; €2.915.065
  - HS4U: Healthy Ship 4 U; 2022-2025; €6.514.729
  - ENDORSE: Safe, Efficient and Integrated Indoor Robotic Fleet for Logistic Applications in Healthcare and Commercial Spaces; MSCA-RISE; 2018-2022; €1.122.400



## Facts about our Laboratory

- A petascale cloud computing platform >200.000 GPU cores for efficient experimentation on deep learning
- In-house cloud computing services for real time data acquisition from external sensors and streaming
- Robotic arm, drones for case studies
- 3D printers for rapid prototyping
- Virtual Reality–VR & Mixed Reality–MR
- Computational modelling software
- High quality portable EEG platform
- Portable and static eye-trackers
- Various cameras
- Modern premises for ~30 researchers
- High-end workstations









G. Dimas, E. Cholopoulou, and D.K. Iakovidis, "E Pluribus Unum Interpretable Convolutional Neural Networks," Scientific Reports, vol. 13, 11421, 2023
G. Dimas, P.G. Kalozoumis, P. Vartholomeos, D. K. Iakovidis, "ArachNet: Interpretable Sub-Arachnoid Space Segmentation using an Additive Convolutional Neural Network," in Proc. International Symposium on Biomedical Imaging (ISBI), 2024

# Interpretable Data Classification based on Fuzzy Similarity Phrases (FSPs)

- Receives any data as input
- It automatically extracts rules from data in the form of linguistically expressible phrases
- Easier interpretable because it produces fewer rules than SoA methods
- Uncertainty-aware and noise tolerant
- Tolerant to missing values

Example: Why is this input image is recognized as a bus?

• Because of the extracted rules expressed as FSPs which look like these:





M.D. Vasilakakis, and D.K. lakovidis, "Fuzzy Similarity Phrases for Interpretable Data Classification," Information Sciences, vol. 624, pp. 881-907, 2023

# Interpretable Data Classification based on Causal Fuzzy Graphs

- Extracts a vocabulary of semantically-relevant concepts
- Automatically extracts causal relations between these concepts and creates a fuzzy cognitive map (FCM) graph
- Classifies data after reasoning performed based on that graph
- Uncertainty-aware and noise tolerant

Example: Why is this input image classified as an elephant?

 Because parts of the elephant exhibit low/medium/high similarity with the parts of the training images forming the vocabulary





G. Sovatzidi, M. Vasilakakis, D. K. lakovidis, "Towards the Interpretation of Multi-label Image Classification using Transformers and Fuzzy Cognitive Maps," WCCI / FUZZ-IEEE, 2023; G. Sovatzidi, and D. K. lakovidis, "Interpretable EEG-based Emotion Recognition using Fuzzy Cognitive Maps," MIE 2023; G. Sovatzidi, M. Vasilakakis, and D.K. lakovidis, "IF3: An Interpretable Feature Fusion Framework for Lesion Risk Assessment based on Auto-Constructed Fuzzy Cognitive Maps," MICCAI 2022

### Unique Experience & Contributions in a Consortium

- State-of-the-art explainable machine learning methods and novel ideas for progressing beyond the state-of-the-art
- Develop links and enhance interaction between relevant on-going EU projects during the project implementation
- Access to a network of industrial partners and hospitals
- The generality of our methods enables applicability on almost any case study
- Experience from previous projects on case studies that include (but not limited to):
  - Biomedical applications
  - Robotics
  - Cultural heritage
- Scientific dissemination (usually > 15 paper publications per project)
- >10 years experience from proposal evaluations



# Thank you

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(please use both)



