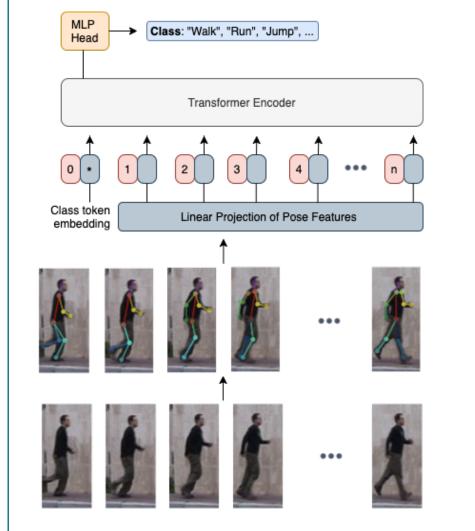


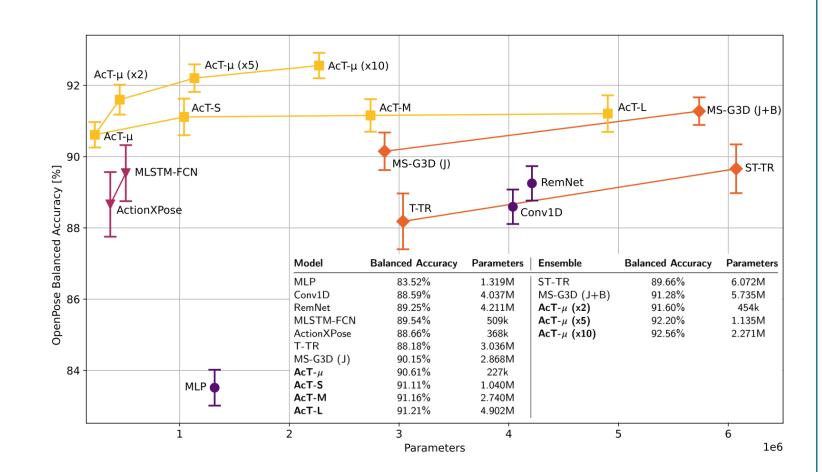
Efficient Deep Learning Models For Robot Perception and Control Simone Angarano **Supervisor: Prof. Marcello Chiaberge**

Research context and motivation

- In the last decade, **Deep Learning** revolutionized artificial intelligence in almost all its • fields of application. Indeed, it allowed to reach impressive results in both perception (computer vision, natural language processing) and decision making (reinforcement learning, navigation). This drastic change was aided by a huge boost in computing capabilities, and by the development of hardware specifically dedicated to massive data processing.
- However, robotic systems usually lack the computational power typically dedicated to deep learning algorithms due to **cost**, **dimensions**, and power **consumption**. Also, critical applications like autonomous navigation must give particular attention to latency, as the slightest delay could cause severe damages to the robot and its surroundings. Due to these challenges, network optimization and edge AI have become of enormous interest in the last few years, as embedding powerful models closer to sensors and actuators is the key for the future of intelligent robotics. • For this reason, my research focuses on the development of deep learning models to obtain intelligent sensors for robot perception, control and decision making. Particular attention is given to key aspects of real-world applications like generalization and robustness. Moreover, the constraints imposed by the application field in terms of latency, power consumption and weight are always taken into account.

Adopted methodologies





Action Transformer: A self-attention model for pose-based human action recognition

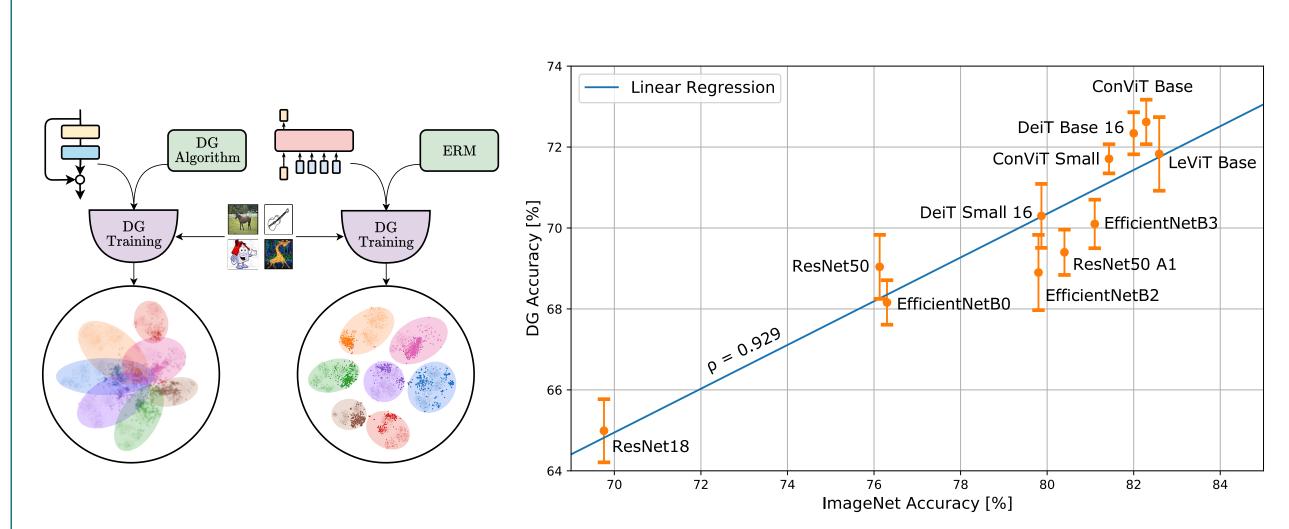
Addressed research questions/problems

- **Real-time perception** for robotic applications \rightarrow Computer Vision, Time Series
- **Network optimization** techniques \rightarrow Quantization, Pruning, Knowledge Distillation

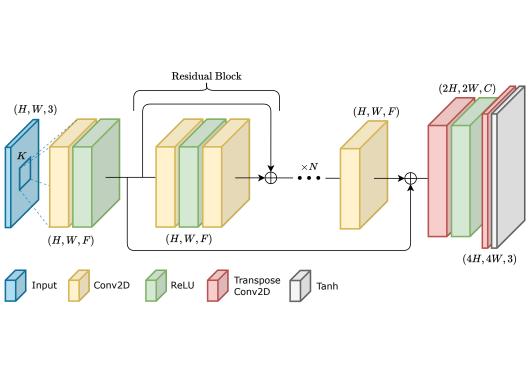
• **Robustness** to out-of-distribution data \rightarrow Domain Generalization, Sim-to-Real Adaptation

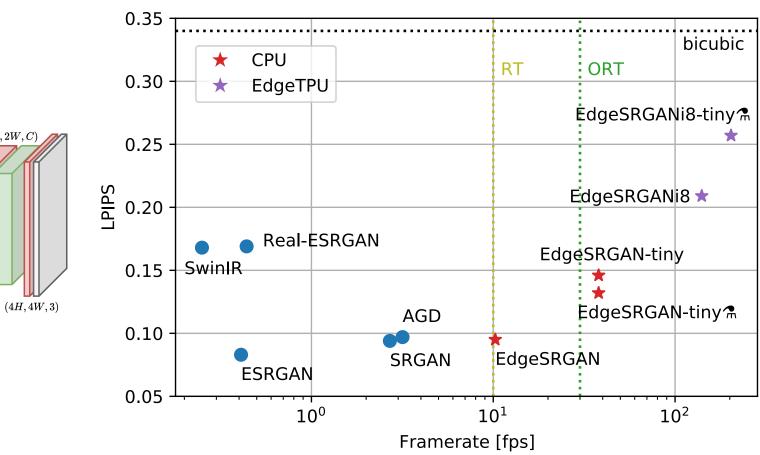
Novel contributions

- A lightweight model for precise Ultra-Wideband ranging error correction for robot indoor **localization** in non-line-of-sight conditions, deployed on a **microcontroller**.
- A real-time transformer model for human action recognition
- A domain generalization benchmark for different kind of deep learning backbones (architecture + training methodology) on popular DG datasets
- A Soft Actor-Critic Deep Reinforcement Learning environment for Position-agnostic **Navigation** in vineyards
- A model to generate global paths for **autonomous navigation** in crops by generating row waypoints from aerial or satellite binary occupancy grids.
- A real-time single image super resolution model trained as a generative adversarial network (GAN) and optimized using knowledge distillation.



Back-to-Bones: Rediscovering the Role of Backbones in Domain Generalization





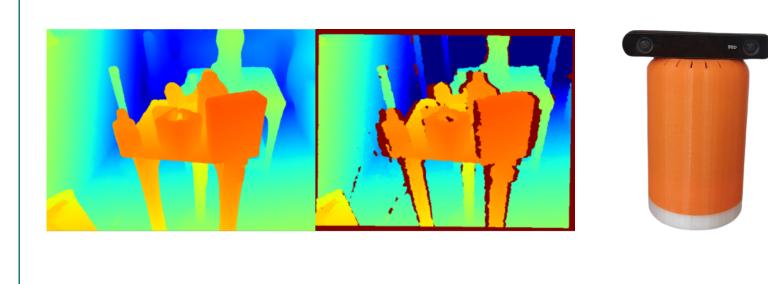
Generative Adversarial Super-Resolution at the Edge with Knowledge Distillation

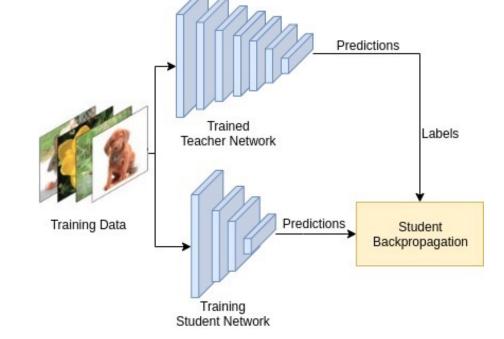
Submitted and published works

- Angarano, S., Salvetti, F., Martini, M., & Chiaberge, M. "Generative Adversarial Super-Resolution at the Edge with Knowledge Distillation". Submitted to Engineering Applications of Artificial Intelligence, 2022.
- Angarano, S., Martini, M., Salvetti, F., Mazzia, V., & Chiaberge, M. "Back-to-Bones: Rediscovering the Role of Backbones in Domain Generalization". Submitted to Pattern Recognition, 2022.
- Martini, M., Cerrato, S., Salvetti, F., Angarano, S., & Chiaberge, M. "Position-Agnostic Autonomous Navigation in Vineyards with Deep Reinforcement Learning". Presented to Conference on Automation Science and Engineering, 2022.
- Salvetti, F., Angarano, S., Martini, M., Cerrato, S., & Chiaberge, M. "Waypoint Generation" in Row-based Crops with Deep Learning and Contrastive Clustering". Presented to European Conference on Machine Learning and Principles and Practice of Knowledge Discovery in Databases, 2022.
- Angarano, S., Salvetti, F., Mazzia, V., Fantin, G., Gandini, D., & Chiaberge, M. "Ultra-Low-Power Range Error Mitigation for Ultra-Wideband Precise Localization". Science and Information Conference (pp. 814-824). Springer, Cham, 2022.
- Mazzia, V., Angarano, S., Salvetti, F., Angelini, F., & Chiaberge, M. "Action Transformer: A self-attention model for short-time pose-based human action recognition". Pattern Recognition, 124, 108487, 2022.
- Angarano, S., Mazzia, V., Salvetti, F., Fantin, G., & Chiaberge, M. "Robust ultrawideband range error mitigation with deep learning at the edge". Engineering Applications of Artificial Intelligence, 102, 104278, 2022.

Future work

- **Sim2Real** generalization for depth images
- **Continual self supervised** learning agent
- Knowledge distillation using Sparse Neural Networks





List of attended classes

- 01UNXRV *Thinking out of the box* (14/11/2021, 1 CFU)
- 01QTEIU Data mining concepts and algorithms (03/02/2022, 4 CFU)
- 01UJUIU Human-Ai Interaction (09/02/2022, 4 CFU)
- 01TUFRV All you need to know about research data management and open access *publishing* (12/04/2022, 3 CFU)
- 01QORRV Writing Scientific Papers in English (05/05/2022, 3 CFU)
- 01UJBRV Adversarial training of neural networks (06/06/2022, 3 CFU)
- 01DNMIU Optimized execution of neural networks at the edge (05/09/2022, 5 CFU)







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