# VINCENZO LOMONACO

Last Updated: 24-05-2022

Personal Information	Vincenzo Lomonaco Date of Birth: 16-08-1991 Residence: Pisa, Italy	vincenzo.lomonaco@unipi.it vincenzolomonaco.com
BIBLIOMETRIC INDICATORS	Citations: 1125 H-Index: 14 i10-Index: 19 by <i>Google Scholar</i> .	285 190 95 2016 2017 2018 2019 2020 2021 0
Research Interests	Artificial Intelligence Machine Learning Deep Learning Continual Learning	Citation / Year
CURRENT Position		) ce and Engineering, University of Pisa igence, Machine Learning, Continual Learning.
Experiences	Supervisor: Prof. Davide Malto Research topics: Machine Learn Affiliate Researcher 2019 - 2020 (6 months) AI Labs, Bologna, Italy Supervisor: Prof. Fabio Cuzzoli Description: Collaboration on the matic Video Captioning" with Oxford Brookes.	ing, Continual Learning, Computer Vision.
	Visiting Researcher 2019 (3 months) Numenta, Redwood City, Unite Supervisor: Jeff Hawkins, Subut Description: Exploratory resear tinual Learning.	
		ce n the <i>Autonomous Systems and Robotics Lab</i> lead g on Continual Learning for Robotics.

#### Visiting Researcher

2017 - 2018 (6 months)
Purdue University, West Lafayette, United States
Supervisor: Prof. Eugenio Culurciello
Description: Vising researcher in the *e-Lab* laboratory lead by Prof. Eugenio Culurciello. Working on Continual Reinforcement Learning with Deep Architectures.

# Machine Learning Software Engineer

2014 - 2015 (6 months)
University of Modena and Reggio-Emilia
Supervisor: Luca Zanni, Riccardo Martoglia
Description: Working on a research project in collaboration with the company *ILD* In-line Devices on the optimization of ML algorithms on embedded devices with MicroLinux OS.

# Students Representative

2009 - 2019

Doctoral Students Representative. Department of Computer Science and Engineering, University of Bologna, 2016-2019. Italy.

Students Representative. Department of Physics, Mathematics and Computer Science. University of Modena and Reggio-Emilia, 2012-2013, Italy.

## **EDUCATION** Doctoral Degree in Computer Science and Engineering

2015 - 2019
University of Bologna
Supervisor: Prof. Davide Maltoni
Dissertation: Continual Learning with Deep Architectures
Specialization: Deep Learning, Continual Learning, Computer Vision.

# Independent Courses

2014 - Present

Stanford Artificial Intelligence Course (by Udacity) John Hopkins Practical Machine Learning Course (by Coursera) Stanford Machine Learning Course (by Coursera) Deep Learning Course by Google (by Udacity)

# Master Degree in Computer Science

2013 - 2015
Grade: 110/110 with Honors
University of Bologna
Supervisor: Prof. Davide Maltoni
Dissertation: Deep Learning for Computer Vision: a Comparison Between Convolutional Neural Networks and Hierarchical Temporal Memories on Object Recognition Tasks
Specialization: Artificial Intelligence, Deep Learning, Parallel Computing.

#### **Bachelor in Computer Science**

2010 - 2013
Grade: 110/110 with Honors
Università di Modena e Reggio-Emilia
Supervisor: Prof. Riccardo Martoglia
Dissertation: Progettazione, Realizzazione ed Accessibilità di un Database Biomolecolare sulle Sequenze Ultraconservate del Genoma Umano
Specialization: Data Analysis, Information Retrieval, Parallel Computing.

# DOCTORAL DISSERTATION

Vincenzo Lomonaco Continual Learning with Deep Architectures Doctoral Dissertation, University of Bologna. Computer Science and Engineering PhD Program, XXXI Cycle. doi: 10.6092/unibo/amsdottorato/9073

Awards: The dissertation was awarded by the *Italian Association for Artificial Intelligence* as one of the top-5 best doctoral dissertation of 2019 in Italy.

Abstract: Humans have the extraordinary ability to learn continually from experience. Not only we can apply previously learned knowledge and skills to new situations, we can also use these as the foundation for later learning. One of the grand goals of Artificial Intelligence (AI) is building an artificial "continual learning" agent that constructs a sophisticated understanding of the world from its own experience through the autonomous incremental development of ever more complex knowledge and skills. However, despite early speculations and few pioneering works, very little research and effort has been devoted to address this vision. Current AI systems greatly suffer from the exposure to new data or environments which even slightly differ from the ones for which they have been trained for. Moreover, the learning process is usually constrained on fixed datasets within narrow and isolated tasks which may hardly lead to the emergence of more complex and autonomous intelligent behaviors. In essence, continual learning and adaptation capabilities, while more than often thought as fundamental pillars of every intelligent agent, have been mostly left out of the main AI research focus. In this dissertation, we study the application of these ideas in light of the more recent advances in machine learning research and in the context of deep architectures for AI. We propose a comprehensive and unifying framework for continual learning, new metrics, benchmarks and algorithms, as well as providing substantial experimental evaluations in different supervised, unsupervised and reinforcement learning tasks.

#### SCIENTIFIC . PUBLICATIONS

# Journal Publications

Andrea Cossu, Gabriele Graffieti, Lorenzo Pellegrini, Davide Maltoni, Davide Bacciu, Antonio Carta, Vincenzo Lomonaco. *Is Class-Incremental Enough for Continual Learning?* Frontiers in Computer Science, 2021. doi: https://doi.org/10.3389/frai.2022.829842 Journal Quality (SJR): Q1

Vincenzo Lomonaco, Lorenzo Pellegrini, Pau Rodriguez, Massimo Caccia, Qi She, Yu

Chen, Quentin Jodelet, Ruiping Wang, Zheda Mai, David Vazquez, German I. Parisi, Nikhil Churamani, Marc Pickett, Issam Laradji, Davide Maltoni. *CVPR 2020 Continual Learning in Computer Vision Competition: Approaches, Results, Current Challenges and Future Directions.* Elsevier Journal Artificial Intelligence, 2021. doi: https://doi.org/10.1016/j.artint.2021.103635 Journal Quality (SJR): Q1

Andrea Cossu, Antonio Carta, Vincenzo Lomonaco, Davide Bacciu Continual Learning for Recurrent Neural Networks: an Empirical Evaluation Elsevier Neural Networks Journal, 2021 doi: 10.1016/j.neunet.2021.07.021 Journal Quality (SJR): Q1

Heechul Bae, Eoin Brophy, Rosa HM Chan, Baoquan Chen, Fan Feng, Gabriele Graffieti, Vidit Goel, Xinyue Hao, Hyonyoung Han, Sathursan Kanagarajah, Somesh Kumar, Siew-Kei Lam, Tin Lun Lam, Chuanlin Lan, Qi Liu, Vincenzo Lomonaco, Liang Ma, Davide Maltoni, German I Parisi, Lorenzo Pellegrini, Duvindu Piyasena, Shiliang Pu, Qi She, Debdoot Sheet, Soonyong Song, Youngsung Son, Zhengwei Wang, Tomas E Ward, Jianwen Wu, Meiqing Wu, Di Xie, Yangsheng Xu, Lin Yang, Qihan Yang, Qiaoyong Zhong, Liguang Zhou *IROS 2019 Lifelong Robotic Vision: Object Recognition Challenge* IEEE Robotics & Automation Magazine, 27(2), pp.11-16, 2020. doi: 10.1109/MRA.2020.2987186 Journal Quality (SJR): Q1

Timothée Lesort, Vincenzo Lomonaco, Andrei Stoian, Davide Maltoni, David Filliat, Natalia Díaz-Rodríguez Continual Learning for Robotics: Definition, Framework, Learning Strategies, Opportunities and Challenges Information Fusion, 58, pp.52-68, 2020. doi: https://doi.org/10.1016/j.inffus.2019.12.004 Journal Quality (SJR): Q1

Jary Pomponi, Simone Scardapane, Vincenzo Lomonaco, Aurelio Uncini Efficient Continual Learning in Neural Networks with Embedding Regularization Neurocomputing, 2020 doi: https://doi.org/10.1016/j.neucom.2020.01.093 Journal Quality (SJR): Q1

Davide Maltoni, Vincenzo Lomonaco Continuous Learning in Single-Incremental-Task Scenarios Elsevier Neural Networks Journal, 2019 doi: 10.1016/j.neunet.2019.03.010 Journal Quality (SJR): Q1

Vincenzo Lomonaco, Riccardo Martoglia, Federica Mandreoli, Laura Anderlucci, Warren Emmett, Silvio Bicciato, Cristian Taccioli UCbase 2.0: Ultraconserved Sequences Database (2014 update) Database: The Journal of Biological Databases and Curation, 2014.

# doi: 10.1093/database/bau062

Journal Quality (SJR): Q1

# **Conference & Workshop Publications**

Gabriele Merlin, Vincenzo Lomonaco, Andrea Cossu, Antonio Carta, Davide Bacciu Practical Recommendations for Replay-based Continual Learning Methods Novel Benchmarks and Approaches for Real-World Continual Learning Workshop, ICIAP 2022.

doi: https://doi.org/10.48550/arXiv.2203.10317

Valerio De Caro, Saira Bano, Achilles Machumilane, Alberto Gotta, Pietro Cassará, Antonio Carta, Christos Sardianos, Christos Chronis, Iraklis Varlamis, Konstantinos Tserpes, Vincenzo Lomonaco, Claudio Gallicchio, Davide Bacciu *AI-as-a-Service Toolkit for Human-Centered Intelligence in Autonomous Driving* 

Demostration at the International Conference on Pervasive Computing and Communications (PerCom), 2022.

doi: https://10.1109/PerComWorkshops53856.2022.9767501

Nicolò Lucchesi, Antonio Carta, Vincenzo Lomonaco, Davide Bacciu Avalanche RL: a Continual Reinforcement Learning Library International Conference on Image Analysis and Processing (ICIAP), 2022. doi: https://doi.org/10.1007/978-3-031-06427-2\_44 Conference Quality (GGS): B

Antonio Carta, Andrea Cossu, Vincenzo Lomonaco, Davide Bacciu Ex-Model: Continual Learning from a Stream of Trained Models Continual Learning in Computer Vision Workshop at CVPR, 2022. doi: https://doi.org/10.48550/arXiv.2112.06511

Davide Bacciu, Antonio Carta, Daniele Di Sarli, Claudio Gallicchio, Vincenzo Lomonaco, Salvatore Petroni *Towards Functional Safety Compliance of Recurrent Neural Networks* International Conference on AI for People (CAIP), 2021. doi: http://dx.doi.org/10.4108/eai.20-11-2021.2314139 Conference Quality (GGS): N.A.

Andrea Cossu, Marta Ziosi, Vincenzo Lomonaco Sustainable Artificial Intelligence through Continual Learning International Conference on AI for People (CAIP), 2021. doi: https://doi.org/10.48550/arXiv.2111.09437 Conference Quality (GGS): N.A.

Ajmal Shahbaz, Salman Khan, Mohammad Asiful Hossain, Vincenzo Lomonaco, Kevin Cannons, Zhan Xu, Fabio Cuzzolin International Workshop on Continual Semi-Supervised Learning: Introduction, Benchmarks and Baselines IJCAI Workshop on Continual Semi-Supervised Learning, 2021.

# preprint: abs/2110.14613

Workshop Paper

Davide Bacciu, Siranush Akarmazyan, Eric Armengaud, Manlio Bacco, George Bravos, Calogero Calandra, Emanuele Carlini, Antonio Carta, Pietro Cassara, Massimo Coppola, Charalampos Davalas, Patrizio Dazzi, Maria Carmela Degennaro, Daniele Di Sarli, Jürgen Dobaj, Claudio Gallicchio, Sylvain Girbal, Alberto Gotta, Riccardo Groppo, Vincenzo Lomonaco, Georg Macher, Daniele Mazzei, Gabriele Mencagli, Dimitrios Michail, Alessio Micheli, Roberta Peroglio, Salvatore Petroni, Rosaria Potenza, Farank Pourdanesh, Christos Sardianos, Konstantinos Tserpes, Fulvio Tagliabò, Jakob Valtl, Iraklis Varlamis, Omar Veledar *TEACHING: Trustworthy Autonomous Cyber-physical Applications through Human*-

Centred Intelligence IEEE International Conference on Omni-layer Intelligent systems, 2021. preprint: abs/2107.06543 Conference Quality (GGS): N.A.

Lorenzo Pellegrini, Vincenzo Lomonaco, Gabriele Graffieti, Davide Maltoni Distilled Replay: Overcoming Forgetting through Synthetic Samples IJCAI Workshop on Continual Semi-Supervised Learning, 2021. preprint: abs/2103.15851 Workshop Paper

Lorenzo Pellegrini, Vincenzo Lomonaco, Gabriele Graffieti, Davide Maltoni Continual Learning at the Edge: Real-Time Training on Smartphone Devices European Symposium on Artificial Neural Networks (ESANN), 2021. doi: 10.14428/esann/2021.ES2021-136 Conference Quality (GGS): B

Andrea Cossu, Davide Bacciu, Antonio Carta, Claudio Gallicchio, Vincenzo Lomonaco Continual Learning with Echo State Networks European Symposium on Artificial Neural Networks (ESANN), 2021. doi: 10.14428/esann/2021.ES2021-80 Conference Quality (GGS): B

Vincenzo Lomonaco, Lorenzo Pellegrini, Andrea Cossu, Antonio Carta, Gabriele Graffieti et al *Avalanche: an End-to-End Library for Continual Learning* 2nd Workshop on Continual Learning in Computer Vision at CVPR 2021. doi: https://arxiv.org/pdf/2104.00405.pdf Workshop Paper

Leonardo Ravaglia, Manuele Rusci, Alessandro Capotondi, Francesco Conti, Lorenzo Pellegrini, Vincenzo Lomonaco, Davide Maltoni and Luca Benini Memory-Latency-Accuracy Trade-offs for Continual Learning on a RISC-V Extreme-Edge Node IEEE International Workshop on Signal Processing Systems (SiPS), 2020. doi: 10.1109/SiPS50750.2020.9195220 Conference Quality (GGS): B

Lorenzo Pellegrini, Gabrile Graffieti, Vincenzo Lomonaco, Davide Maltoni

Latent Replay for Real-Time Continual Learning International Conference on Intelligent Robots and Systems (IROS), 2020 preprint: abs/1912.01100 Conference Quality (GGS): A+

Qi She, Fan Feng, Xinyue Hao, Qihan Yang, Chuanlin Lan, Vincenzo Lomonaco, Xuesong Shi, Zhengwei Wang, Yao Guo, Yimin Zhang, Fei Qiao, Rosa HM Chan OpenLORIS-Object: A Dataset and Benchmark Towards Lifelong Object Recognition International Conference on Robotics and Automation (ICRA), 2020 preprint: abs/1911.06487 Conference Quality (GGS): A

Vincenzo Lomonaco, Davide Maltoni, Lorenzo Pellegrini Rehearsal-Free Continual Learning over Small Non-I.I.D. Batches Continual Learning Workshop at CVPR, 2020 doi: 10.1109/CVPRW50498.2020.00131 Workshop Paper

Vincenzo Lomonaco, Karan Desai, Eugenio Culurciello, Davide Maltoni Continual Reinforcement Learning in 3D Non-stationary Environments Continual Learning Workshop at CVPR, 2020 doi: 10.1109/CVPRW50498.2020.00132 Workshop Paper

Vincenzo Lomonaco, Lorenzo Pellegrini, Davide Maltoni Apprendimento Automatico Continuo per la Robotica e la Visione Artificiale Ital-IA, Convegno Nazionale CINI sull'Intelligenza Artificiale, 2019 website: http://www.ital-ia.it/submission/90/paper Conference Quality (GGS): N.D.

Vincenzo Lomonaco, Angelo Trotta, Marta Ziosi, Juan de Dios Yáñez Ávila, Natalia Díaz-Rodríguez Intelligent Drone Swarm for Search and Rescue Operations at Sea AI for Social Good Workshop at NeurIPS, 2018 preprint: abs/1811.05291 Workshop Paper

Natalia Díaz-Rodríguez, Vincenzo Lomonaco, David Filliat, Davide Maltoni Don't Forget, There is More than Forgetting: new Metrics for Continual Learning Continual Learning Workshop at NeurIPS, 2018 preprint: abs/1810.13166 Workshop Paper

Claudia Carpineti, Vincenzo Lomonaco, Luca Bedogni, Marco Di Felice, Luciano Bononi Custom Dual Transportation Mode Detection by Smartphone Devices Exploiting Sensor Diversity IEEE International Conference on Pervasive Computing and Communications Workshops (PerCom Workshops), 2018 doi: 10.1109/PERCOMW.2018.8480119 Workshop Paper

Vincenzo Lomonaco, Davide Maltoni CORe50: a new Dataset and Benchmark for Continuous Object Recognition Conference on Robot Learning (CoRL), pp. 17-26, 2017 website: http://proceedings.mlr.press/v78/lomonaco17a.html Conference Quality (GGS): N.D.

Davide Maltoni, Vincenzo Lomonaco Semi-Supervised Tuning from Temporal Coherence 23rd International Conference on Pattern Recognition (ICPR), 2016 doi: 10.1109/ICPR.2016.7900013 Conference Quality (GGS): A-

Vincenzo Lomonaco, Davide Maltoni Comparing Incremental Learning Strategies for Convolutional Neural Networks IAPR Workshop on Artificial Neural Networks in Pattern Recognition, 2016 doi: 10.1007/978-3-319-46182-3\_15 Workshop Paper

Daniel Russo, Vincenzo Lomonaco, Paolo Ciancarini
A Machine Learning Approach for Continuous Development
International Conference in Software Engineering for Defence Applications, 2016
doi: 10.1007/978-3-319-70578-1\_11
Conference Quality (GGS): N.D.

# Other Publications

German I. Parisi, Vincenzo Lomonaco Online Continual Learning on Sequences Recent Trends in Learning From Data. Springer, Cham. pp.197-221, 2020 doi: 10.1007/978-3-030-43883-8\_8 Book Chapter

Vincenzo Lomonaco Continual Learning with Deep Architectures University of Bologna, PhD Thesis, 2019 doi: 10.6092/unibo/amsdottorato/9073 Doctoral Dissertation

Vincenzo Lomonaco Deep Learning for Computer Vision: a Comparison Between Convolutional Neural Networks and Hierarchical Temporal Memories on Object Recognition Tasks Master Thesis, University of Bologna, 2015 website: https://amslaurea.unibo.it/9095/1/Vincenzo\_Lomonaco\_tesi.pdf Master Degree Dissertation

**RESEARCH**Continual Learning for Predictive Maintainence**PROJECTS**Description: Research contract with the SeaVision Group for the research and development of ariginal continual learning solutions applied to predictive maintainance

in the pharmaceutical domain. Involvement: Principal Investigator.

# TEACHING: A computing Toolkit for building Efficient Autonomous appliCations leveraging Humanistic INtelliGence

Description: EU-funded project that designs a computing platform and the associated software toolkit supporting the development and deployment of autonomous, adaptive and dependable CPSoS applications, allowing them to exploit a sustainable human feedback to drive, optimize and personalize the provisioning of their services.

Involvement: Task leader.

# Image Manipulation Attack Resolving Solutions

Description: The iMARS research project, fully funded by the European Union for a total budget of 7+ Million, aims at designing new solutions for the detection of morphing attacks and digital image manipulations in order to provide accurate verification of ID documents. Involvement: Participant.

#### Recycle Symbols Detection on Embedded Cameras

Description: In collaboration with the Hera Group, one of the biggest multi-services companies in Italy, the project was centered around the prototyping of an object detection API service running directly on the edge on Android mobile phones. Involvement: Participant.

Events Organization	General Chair 2020 - Present
	Co-Organizer of <i>"Deep Continual Learning"</i> , Dagstuhl Seminar 23122, March 19 – 24 , 2023 (Participants: 50, invite-only)
	General Chair for the 1st edition of the Workshop "Novel Benchmarks and Approaches for Real-World Continual Learning" at ICIAP 2021. (Participants: 50-100)
	General Chair for the 3rd edition of the Workshop "Continual Learning for Computer Vision" at CVPR 2022. (Participants: 250-300)
	General Chair for the 1st "Semi-Supervised Continual Learning Workshop" at IJ-CAI 2021. (Participants: 250-300)
	General Chair for the 1st "Theory of Continual Learning Workshop" at ICML 2021. (Participants: 250-300)
	General Chair for the 2nd edition of the Workshop "Continual Learning for Computer Vision" at CVPR 2021. (Participants: 250-300)
	General Chair for the Workshop "Continual Learning for Computer Vision" at CVPR 2021. (Participants: 250-300)

General Chair for the workshop "Generative Models for Continual Learning", organized by ContinualAI, February 2020. (Participants: 30-50)

General Chair for the workshop "Neuroscience-Inspired Continual Learning", organized by ContinualAI, March 2020. (Participants: 30-50)

General Chair for the workshop "Real-World Applications of Continual Learning", organized by ContinualAI, April 2020. (Participants: 30-50)

General Chair for the workshop "Continual Learning with Sequential Streaming Data", organized by ContinualAI, May 2020. (Participants: 30-50)

General Chair for the workshop "Continual Learning: in the Cloud, at the Edge or Both?", organized by ContinualAI, June 2020. (Participants: 30-50)

General Chair for the workshop "ContinualAI Wiki 1.0", organized by ContinualAI, September 2020. (Participants: 30-50)

General Chair for the workshop "Generalization and Robustness in Continual Learning, organized by ContinualAI, October 2020. (Participants: 30-50)

Program Chair

2021 - Present

Program Chair for: AI for People conference 2021.

Session Chair

2020 - Present

Special Session Chair "Continual Learning and Emergence of Intelligent Systems: Theory and Application" (IJCNN 2022)

Special Session Chair "Advances in Continual Learning: beyond Catastrophic Forgetting" for IEEE EAIS 2021 conference.

Special Session Chair "AI for People" for the GOODTECHS 2020 conference.

Special Session Chair "New Trends in Continual Learning with Deep Architectures" for IEEE EAIS 2020 conference.

**EDITORIAL** Author e Technical Reviewer CONTRIBUTIONS 2016 - Present

Vincenzo Lomonaco. Deep Learning with R. Packt Publishing, 2017 (Author).

Oneto, L., Navarin, N., Sperduti, A., Anguita, D., *Recent Trends in Learning From Data*. Springer, 2019. (Book Chapter Author)

Joshua F. Wiley. *R Deep Learning Essentials*. Packt Publishing, 2016. (Technical Reviewer)

#### **Special Issue Editor**

2020 - Present

Editor of the special issue "Continual Unsupervised Learning in Computer Vision", Frontiers in Computer Science, 2022.

Editor of the special issue "Adaptive Machines: Leveraging Neuroscience for Lifelong Learning Systems" for the Frontiers in Artificial Intelligence Journal, 2021.

Editor of the special issue "Lifelong Learning Machines" for the Elsevier Journal Neural Networks, 2021.

Editor of the special issue "AI for People" for the Springer Journal AI & Society: Journal of Knowledge, Culture and Communication, 2020.

# TEACHING Teaching

2020 - Present

#### ACTIVITIES & INVITED TALKS

Artificial Intelligence Fundamentals, Master Degree in Computer Science, University of Pisa (2021 - Present, 1 academic year).

Continual Learning: On Machines that can Learn Continually, PhD Course, University of Pisa (2021 - Present, 1 academic year).

Medical Computer Science, Medical Degree, University of Pisa (2021 - 2022, 1 academic years).

**Programming Laboratory I**, Bachelor Degree in Computer Science, University of Pisa (2020 - 2021, 1 academic years).

# **Teaching Assistant**

2014 - Present

**Computer Architectures**, Bachelor Degree in Computer Science, University of Bologna (2016 - Present, 5 academic years).

Foundations of Computer Science, Bachelor Degree Management Engineering, University of Bologna (2014 - 2016, 2 academic years).

Parallel Computing, Bachelor Degree in Computer Science, University of Modena and Reggio-Emilia (2016 - 2016, 1 academic year).

# Course Collaborations

2014 - Present

Machine Learning Introduction Lecturer, *Smart Things Course* for the Bachelor Degree in Computer Science, Samsung Innovation Campus & University of Pisa, 2020 - 2021 (1 academic year).

Continual Learning Day Leader & Content Creator for the Neuromatch Deep Learn-

ing Academy (Summer School), August 2021.

Invited Seminar "Open-Source Frameworks for Deep Learning: an Overview", within the Machine Learning master degree course, University of Bologna, 2018-2020 (for 3 academic years).

Collaborating on the course material preparation and laboratory infrastructure for the master degree course Machine Learning, University of Bologna, 2018-2020 (for 3 academic years).

#### **Tutorials**

2019 - Present

Tutorial "Continual Learning with Deep Architectures" for the conference International Conference on Machine Learning (ICML), Virtual Only, 2021.

Tutorial "Continual Lifelong Learning with Neural Networks" for the conference 2019 INNS Big Data e Deep Learning, Sestri Levante, Italy, 2019.

## Invited Talks

2017 - Present

Invited Talk "Continuous Unsupervised Training of Deep Architectures", Istituto Italiano di Tecnologia (IIT), Genoa. 6 July 2017.

Invited Talk "Continuous Learning with Deep Architectures", Neurala, Boston. 25 March 2017.

Invited Talk "Continuous Learning with Deep Architectures", Autonomous System and Robotics, ENSTA ParisTech, Paris. 17 May 2018.

Invited Talk "Continual Learning with Deep Architectures", Computer VISIONers Conference, Kyiv, Ukraine. 6 October 2018.

Invited Talk "Continual/Lifelong Learning with Deep Architectures", Data Science Milan, Milano, Italy. 28 January 2019.

Invited Talk "Open-Source Frameworks for Deep Learning: an Overview", Data Science Bologna @ Musixmatch, Italy. 28 February 2019.

Invited Talk "Continual Reinforcement Learning in 3D Non-stationary Environments", Computational Science Lab @ UPF, Barcelona, Spain. 29 March 2019.

Invited Talk "Apprendimento Automatico Continuo per la Robotica e l'Intelligenza Artificiale", Codemotion Meetup @ AlmaCube, Bologna, 4 July 2019.

Invited Talk "Continual Learning for Robotics", Istituto Italiano di Tecnologia (IIT), Genoa. 9 September 2019.

Invited Talk "Continual Learning: Another Step Towards Truly Intelligent Machines", Numenta, Redwood City, California, 16 September 2019.

Invited Talk "Toward Continual Learning on the Edge", Apple, Cupertino, United States, 21 November 2019.

Invited Talk "Toward Continual Learning on the Edge", University of Pisa, Pisa, Italy, 14 February 2020.

Invited Talk "Towards Continual Learning at the Edge", MILA, Montreal, Canada, 27 March 2020.

Invited Talk "Towards Continual Learning at the Edge", HiPeRT Lab @ Unimore, Modena, Italy, 18 May 2020.

Invited Talk "Continual Learning for Production Systems", MILA, PRODUCTION.AI conference, Kiev, Ukraine, 27 May 2020.

Invited Talk "Continual Learning for AI", 1st AlforPople Workshop, Online, 9 Agosto 2020.

Invited Talk "Continual Learning, Neuroscience and Robotics: an Entwined Destiny", Lifelong Learning for Long-term Human-Robot Interaction Workshop, Online, 4 September 2020.

Invited Talk "Real-Time Continual Learning from Natural Video Streams", Humancentered Vision: from Body Analysis to Learning and Language Workshop, Online, 9th September 2020.

Invited Talk "Rehearsal-Free Continual Learning over Small non-I.I.D Batches", ContinualAI Meetup, 27-11-2020.

Invited Talk "Sustainable AI through Continual Learning", Continual Learning: Towards "Broad" AI course, Université de Montréal, 25-01-2021.

Invited Talk "Sustainable AI through Continual Learning", ML & Data Science Meetup, 27-05-2020.

Invited Talk "Open-Source Frameworks for Deep Learning: an Overview", Machine Learning Course, University of Bologna, Italy, 2020.

Invited Talk "Towards Continual Learning at the Edge", Twitter, ML seminar, 03-12-2020.

Invited Talk "An Overview of Continual Learning Scenarios & Benchmarks", ContinualAI Meetup 27-11-2020.

Invited Talk "Introduction to Continual Learning", Enel, 28-10-21.

Invited Talk "Introduction to Continual Learning", Generali Italia, 21-10-21.

Invited Talk "Distributed Continual Learning: Challenges and Opportunities", Invited Talk, Workshop on Continual Learning and Adaptation for Time Evolving Data, 2021.

Invited Talk "Continual Learning with Deep Architectures", MLDM Italia, AIxIA conference, 2021.

Invited Talk "Sustainable AI through Continual Learning", SMART Cloud 3 - AI Machine Learning, 10-19-2021.

Invited Talk "Avalanche: an End-to-End Library for Continual Learning", Intel corporation, 11-05-2021.

Invited Talk "Introduction to Continual Learning", Intelligent Systems & Pattern Recognition course, University of Pisa, 20-03-21.

Invited Talk "Continual Learning: On Machines that Can Learn Continually", H&M, 10-06-21.

Invited Talk "Avalanche: an End-to-End Library for Continual Learning", AI2, 1-06-2021.

Invited Talk "The Thousand Brains Theory of Intelligence", Computational Neuroscience Course, University of Pisa, 26-05-2021.

Invited Talk "Sustainable AI through Continual Learning", Sea Vision srl, Italy, 26-04-2021.

Invited Talk "CORe: an Android App for Continual Object Recognition at the Edge", Workshop on On-Device Machine Learning, 4-04-2021.

Invited Talk "Sustainable AI through Continual Learning", ML Modena Meetup, 30-03-2021.

Invited Talk "Sustainable AI through Continual Learning", Department of Computer Science - University of Pisa 22-03-2021.

Invited Talk "Introduction to Continual Learning", PhD in Data Science, PhD course, UniRoma, 21-04-22.

Invited Talk "Introduction to Continual Learning", Intelligent Systems and Pattern Recognition course, University of Pisa, 20-04-22.

Invited Talk "Ex-Model Continual Learning: a New Paradigm for Distributed Robotics Intelligence", Invited Talk at Workshop on Lifelong Learning and Personalization in Long-Term Human-Robot Interaction 2022.

Invited Talk "Introduction to Continual Learning, AI Seminars", Sapienza University, Rome, Italy, 24-3-22.

Invited Talk "Avalanche: an End-to-End Library for Continual Learning", CLVision Workshop, CVPR, 2022.

Invited Talk "Introduction to Continual Learning", School of AI, University of Modena and Reggio-Emilia, 2022.

Invited Talk "Introduction to Continual Learning", Baker Hughes, 2022.

ACADEMIC SERVICES & DISSEMINATION ACTIVITIES **Co-Founder & President** 2018 - Present ContinualAI

**President** of the non-profit research organization *ContinualAI*. ContinualAI is the largest research organization and open community on Continual Learning for Artificial Intelligence. The organization has more than 1000+ members in 19 different timezones, 5000+ annual users of its online services, 30+ supporting partners, 50+ organized or supported events, 5 active collaborative projects, e 3000+ followers on its social platforms.

website: https://www.continualai.org

#### Co-Founder & Board Director

2019 - Present AlforPeople

**Co-Founder & Board Member** of the non-profit organization *AIforPeople*. The social mission of AIforPeople is the one to learn, pose questions and take initiative on how the technology based on Artificial Intelligence can be used for the social good. website: https://www.aiforpeople.org

# International Doctoral Reviewer

2020 - Present

International Expert for the doctoral evaluation committee for the candidate *Francesco Pelosin* (Ca' Foscari University) and the revision of his doctoral dissertation: "Dissecting Continual Learning: a Structural and Data Analysis", 2022.

International Expert for the doctoral evaluation committee for the candidate  $\hat{A}ngelo$  Garangau Menezes (Universidade de São Paulo) and the revision of his doctoral dissertation: "Continual Object Detection with Deep Neural Networks", 2022.

International Expert for the doctoral evaluation committee for the candidate *Kai Wang* (Universitat Autonoma de Barcelona) and the revision of his doctoral dissertation: "Continual learning for hierarchical classification, meta-learning, and multi-modal learning", 2022.

International Expert for the doctoral evaluation committee for the candidate *Julio Hurtado* (Pontificia Universidad Católica de Chile) and the revision of his doctoral dissertation: "Augmenting Deep Learning models using Continual and Meta Learning strategies", 2022.

International Expert for the doctoral evaluation committee for the candidate *Tom Veniat* (*Sorbonne Université*) and the revision of his doctoral dissertation: "Neural Architecture Search under Budget Constraints", 2021.

International Expert for the doctoral evaluation committee for the candidate Marc Masana (Universitat Autonoma de Barcelona) and the revision of his doctoral

dissertation: "Lifelong Learning of Neural Networks: Detecting Novelty and Adapting to New Domains without Forgetting", 2020.

# Program Committee Member & Reviewer

2019 - Present

IJCAI-PRICAI 2020, IEEE EAIS 2020, GOODTECHS 2020, Continual Learning workshop at ICML 2020, ROMAN Workshop on Lifelong Learning for Longterm HRI, CCNC 2021 Workshop RoboCom, AAAiI-2022, EAIS 2022, CCNC 2022 Workshop RoboCom, PeRConAI 2022, IEEE RA-L, ICPR 2020, IROS 2020, ICML 2020 Continual Learning workshop, ICONIP 2020, ICML 2020 Lifelong Machine Learning, ISBA 2016, ISBA 2017, ISBA 2018, PIMRC2018, CoRL 2017, ICANN 2019, AAAI 2020, ECAI 2020, EAIS 2020, CVPR 2022, ICIAP 2022, ECCV 2022, Conference on Lifelong Learning Agents (CoLLAs) 2022 and a reviewer for prestigious journals / institutions such as Elsevier Cognitive Systems Research, Artificial Intelligence in Medicine and IEEE Access, Journal of Information Security and Applications, Artificial Intelligence Journal, IEEE Access, CVPR 2021, Neural Computing and Applications Journal, ICRA 2021, ICCV 2021, IEEE Transactions on Neural Networks and Learning Systems, Neurocomputing, Mobile Information Systems Hindawi, Evolving Systems, Frontiers Robotics and AI, Elsevier Patter Recognition, TPAMI, Leverhulme Trust, Nature Machine Intelligence among others.

#### Associations

2019 - Present

Active Member of the following associations: *ELLIS*, *CLAIR*, *IEEE*, *IEEE* Computational Intelligence Society, *AIXIA*, *CVPL*, *IAML*, *AIforPeople*, *ContinualAI*, *CINI AIIS*.

# **Podcasting Activity**

2021 - Present

Smarter Podcast: Il Podcast Italiano sull' Intelligenza Artificiale, Co-Organizer and Co-Host (2021 - Present).

**TEACHING** Podcast: Official podcast of the EU Funded Project TEACHING, A computing Toolkit for building Efficient Autonomous appliCations leveraging Humanistic INtelliGence, Lead Organizer and Host (2021 - Present).

Pointer Podcast: Guest Interview on Continual Learning, Avalanche and more, Episode 99th, (4th May, 2022).

Press Articles 2021 - Present

Al Weekly: Continual learning offers a path toward more humanlike Al, Interview, VentureBeat, 2021.

L'IA attuale non è sostenibile: cosa cambia con l'apprendimento automatico continuo, Author, Agenda Digitale, 2022.

#### **Dissemination Videos**

2016 - Present

ContinualAl Seminars, YouTube Collection (2020 - Present).

ContinualAl Meetups, Youtube Collection (2020 - Present).

Announcing the Continual Learning Workshop at CVPR 2022!, YouTube Video, 2022.

Continual Learning Course, YouTube Collection, 2021.

CORe: an Android App for Continual Object Recognition at the Edge, YouTube Video, 2020.

ContinualAI: a Non-Profit Research Organization on Continual Learning for AI, YouTube Video, 2019.

SUPERVISION &PhD Students Supervisor / Co-SupervisorAdvising2019 - Present

Rudy Semola, Department of Computer Science and Engineering, University of Bologna (2021 - Present).

Hamed Hemati, Institute of Computer Science, University of St. Gallen (2021 - Present).

Andrea Cossu, Department of Computer Science, Scuola Normale Superiore (2020 - Present).

Gabriele Graffieti, Department of Computer Science and Engineering, University of Bologna (2020 - Present).

Lorenzo Pellegrini, Department of Computer Science and Engineering, University of Bologna (2019 - Present).

**Thesis Supervisor** / **Co-Supervisor** 2016 - Present

Gabriele Merlin. *Replay-based Approaches for Continual Learning*. University of Pisa, 2021. (Master Thesis)

Niccolò Lucchesi. Extending Avalanche for Continual Reinforcement Learning: Design, Implementation, Experiments and Continual-Habitat-Lab. University of Pisa, 2021. (Master Thesis)

Federico Matteoni. Continual Learning for Human State Monitoring. University of Pisa, 2021. (Bachelor Thesis)

Diego Pergolini. Reinforcement Learning: un caso di Studio nell' Ambito Della Animal-AI Olympics. University of Bologna, 2019. (Master Thesis) Martin Cimmino. *RGB-D Object Recognition for Deep Robotic Learning*. University of Bologna, 2018. (Master Thesis)

Lorenzo Gatto. Apprendimento Continuo per il Riconoscimento di Immagini. University of Bologna, 2018. (Master Thesis)

Giacomo Bartoli. Edge AI: Deep Learning techniques for Computer Vision applied to embedded systems. University of Bologna, 2018. (Master Thesis)

Claudia Carpineti. Sensors Relevance Analysis for Transportation Mode Recognition, University of Bologna, 2017. (Master Thesis)

Giulio Zhou. Machine Learning come Supporto per la Valutazione dei Requisiti Agili. University of Bologna, 2017. (Bachelor Thesis)

Riccardo Monica. Deep Incremental Learning for Object Recognition. University of Bologna, 2016. (Master Thesis)

# Academic Tutor for Industrial Internship

2021 - Present

Emiliano Marrale. "Sistema di AI per Rilevare Anomalie sui Dati", University of Pisa, 2022.

Lorenzo Ferri. "Applying AI Techniques for Data Analysis and Storytelling", University of Pisa, 2022.

Luca Cataldo. "White collar Stress monitorin", University of Pisa, 2021.

Gabriele Masciotti. "Sviluppo di una telecamera intelligente che aggiusta la qualità del video in base alle espressioni del viso", University of Pisa, 2021.

#### Advisor

2021 - Present

Scientific Advisor for Intellia ICT (2021 - Present). website: https://www.intellia.gr

**TECHNICAL**Al & Continual Learning: Continual Learning, Bio-Inspired Artificial Intelligence,**SKILLS**Deep Learning, Computer Vision.

Machine Learning Frameworks: PyTorch, Tensorflow, Caffe, Theano, Keras, H20, MxNetR, Scikit-learn.

Programming Languages: Python, R, C/C++, JAVA, C#, PHP, HTML, CSS, Javascript.

Parallel Computing: C/C++ OpenMP, C/C++ MPI, CUDA, Assembly and *Thread-level Parallelism*.

Tech. & Editorial Tools: PyCharm, Visual Studio, IPython, Sublime Text, Docker,

	Sacred, LaTeX, Overleaf, Premiere Pro, Photoshop, Camtastia Studio.
Languages	Italian (Mother Tongue) English (C1)
Awards & Certificates	W&B Best Library Award: Avalanche was chosen by Weights & Bias as the best Continual Learning library presented ad CLVision 2021.
	Doctoral Dissertation Distinction: The dissertation was awarded by the Italian Association for Artificial Intelligence as one of the top-5 AI PhD Thesis of 2019.
	2nd Classified of the competition " <i>Lifelong Robotic Vision</i> " organized at IROS 2019 with the UniBo team supervised by Prof. Davide Maltoni.
	Winner of the hackathon $HackCortona$ (KCL Tech $+$ Cortona Mix Festival). Cortona, Italy, 2016.
	Winner of the National Short-Film Festival <i>L'educazione fa crescere i diritti</i> organized by CISP, Roma, Italy, 2009.
	English Proficiency Certificate <i>IELTS – International English Language Testing System.</i> Grade 7, 2015.