# Andrea Cossu

Curriculum Vitae



## Personal Statement

I am a post-doc researcher at University of Pisa. My research focuses on Deep Learning and Continual Learning, with the aim of designing Deep Learning agents that learn *over time without forgetting previous knowledge*. My research has been applied to the continual update of pre-trained and foundation models, as well as to recurrent models in non-stationary environments.

## Google Scholar metrics

March 11, H-Index: 10, Citations: 435

2024 Full list of publications provided below.

#### Research Positions

May 1, 2023 - Research Fellow, Computer Science Department, University of Pisa, EU European Innovation ongoing Council (EIC) Pathfinder EMERGE project, Grant No. 101070918 (€2.8M, 4 years) Continual learning for dynamic data and environments.

Dec. 12, **Research Intern**, *Google Brain, Brain Applied Research Team*, Mountain View, California, Dr. 2022 - March Abhijit Ogale

3, 2023 Few-Shot Personalization with Vision-Language Transformers

Feb. 1, 2022, Visiting researcher, KU Leuven, ESAT department, PSI group, Prof. Tinne Tuytelaars

April 30, 2022 Continual Learning with Pre-Trained models and Transformers for Natural Language Processing and Computer Vision

#### Education

2019–2023 PhD in Data Science, Scuola Normale Superiore and University of Pisa, Italy

November, 1, 2019, - July, 17, 2023

Towards Real-World Data Streams for Deep Continual Learning. The thesis is publicly available ath this URL: https://hdl.handle.net/11384/133982

2017–2019 Master Degree in Computer Science - Al curriculum, University of Pisa, Italy

October, 15, 2017 - October, 4, 2019

Thesis on continual learning with recurrent neural networks

2014–2017 Bachelor Degree in Computer Science, University of Pisa, Italy

October, 15 2014 - October, 4, 2017

Thesis on novelty detection with Echo State Networks

#### Affiliations

2023-2024 Research Fellow, University of Pisa

Research Contract on "Continual Learning for Dynamic Environments and Data".

2019-2023 PhD Student, Scuola Normale Superiore and University of Pisa

2021-present Board Member and Treasurer, ContinualAI, non-profit organization

Continual Al is the world's largest organization on continual learning, gathering together more than 1000 researchers and enthusiasts.

2021-present Member, Pervasive AI (PAI) Lab, University of Pisa and CNR

2019-present Member, Computational Intelligence and Machine Learning (CIML) group, University of Pisa

## Research Projects

2023-2026 **Task Leader**, *Emergent Awareness from Minimal Collectives (EMERGE)*, European Innovation Council (EIC), Horizon 2021 EIC Pathfinder challenges, Grant Agreement 101070918

EMERGE will deliver a new philosophical, mathematical, and technological framework to demonstrate, both theoretically and experimentally, how a collaborative awareness – a representation of shared existence, environment and goals – can arise from the interactions of elemental artificial entities. The grant amount is about 3M euros. Task Leader of *T4.2: Life-long learning archetype units*. https://eic-emerge.eu/

#### **Awards**

2021 **Best library award**, *CLVision workshop at CVPR*, Avalanche: an End-to-End library for Continual learning

1,500 USD. Sponsor: Weights and Biases

2022 Avalanche enters PyTorch ecosystem

## Supervision

2024 **Sergio Latrofa**, *Master Degree in Computer Science*, University of Pisa, Boosting non-linearity in reservoirs using Masked Intrinsic Plasticity co-supervised with Andrea Ceni and Davide Bacciu

2024 Giacomo Cignoni, Master Degree in Computer Science, University of Pisa, A Framework for Continual Self Supervised Learning in an Online Setting co-supervised with Antonio Carta

2023 Alessandro Trenta, Master Degree in Mathematics, Scuola Normale Superiore, University of Pisa, Solving Conformal Field Theories with Reinforcement Learning Co-supervised with Pietro Ferrero and Davide Bacciu

2022 Daniele Gabrielli, Bachelor Degree in Computer Science, University of Pisa, (Italian) Piattaforma di Valutazione Continua per Machine Learning Co-supervised with Vincenzo Lomonaco

2021 Mattia Sangermano, Master Degree in Computer Science, University of Pisa, Sample condensation in Online Continual Learning

Co-supervised with Vincenzo Lomonaco, Davide Bacciu, Antonio Carta

2021 Gabriele Merlin, Master Degree in Computer Science, University of Pisa, Replay-based Approaches for Continual Learning Co-supervised with Vincenzo Lomonaco, Davide Bacciu, Antonio Carta

2020 Andrea Rosasco, Master Degree in Computer Science, University of Pisa, Distilled Replay: mitigating forgetting through dataset distillation Co-supervised with Davide Bacciu and Antonio Carta

2020 Newsha Ozgoli, Master Degree in Computer Science, University of Pisa, Evaluation of catastrophic forgetting in Echo State Networks Co-supervised with Davide Bacciu and Claudio Gallicchio

## Teaching activities

April 20, **Teacher (20 hours)**, *Deep Learning laboratory*, Master in Big Data, University of Pisa

2022 - May Practical laboratories based on Keras framework. Topics covered: feedforward neural networks, convo-10, 2022 lutional neural networks for computer vision, recurrent neural networks for time series and sequences, generative models like Generative Adversarial Networks. I also designed the final project together with

Prof. Davide Bacciu and graded half of the submissions.

- Nov. 22, Teaching assistant (16 hours), Continual Learning: On Machines that can Learn Continually,
  - 2021 University of Pisa, Continual AI, First world's open-access course on Continual Learning: https:
- December 20, //course.continualai.org/
  - I revised the material and slides, updated the course website with additional material and references and interacted with the students attending remotely by answering their questions during the lectures. I gave a 30 minutes talk on my research activity on continual sequence learning.
  - April 19, Teacher (20 hours), Deep Learning laboratory, Master in Big Data, University of Pisa
  - 2021 May Practical laboratories based on Keras framework. Topics covered: feedforward neural networks, convo-
  - 17, 2021 Iutional neural networks for computer vision, recurrent neural networks for time series and sequences, generative models like Generative Adversarial Networks. I also designed the final project together with Prof. Davide Bacciu and graded half of the submissions.
  - August 19, Contributor (10 minutes module), Continual Learning nanolecture, Neuromatch academy
    - 2021 I created the slides and practical exercises (jupyter notebooks) for the continual learning evaluation module within Neuromatch school.
- Oct. 1, 2020 **Teaching assistant (20 hours)**, Computer Programming Laboratory 1, Bachelor degree in February 1, Computer Science, University of Pisa
  - 2021 I helped student with exercises and homework in Javascript.
  - Nov. 16, Teacher (24 hours), Machine Learning module, Data Science course, Tree s.r.l.
  - 2020 Dec. I taught the theoretical foundations of machine learning: from linear regression to feedforward neural 3, 2020 networks and convolutional neural networks for both supervised and unsupervised learning. I also introduced computer vision fundamentals and helped the students in the design of their final project.
    - Nov. 17, High-school lecture (2 hours), Gobetti-Volta, Bagno a Ripoli (FI)
      - 2020 Lecture on feedforward neural network and intuition behind backpropagation.
- Oct. 1, 2019 **Teaching assistant (20 hours)**, *Smart Applications*, Master degree in Computer Science, Feb. 1, 2020 University of Pisa

I provide assistance to Prof. Vincenzo Gervasi in the management of the students for the final project of the course. There were 2 practical projects, half of the class worked on the first one, the other half on the second one. Me and Prof. Gervasi switched between one group and the other during lectures to assist the students and provide help in the implementation and methodologies.

## Events organization

- 2024 **Local Chair**, *Third edition of the Conference on Lifelong Learning Agents (CoLLAs)* The leading conference on continual/lifelong learning, held in Pisa.
- 2023 General Co-Chair, 1st ContinualAl Unconference General Chairs: all ContinualAl Board Members. The event had 350 registered attendees and a preregistration track published in Proceedings of Machine Learning Research (PMLR).
- 2023 **Collector**, *Deep Continual Learning Dagstuhl Seminar*Editorial assistance for the final report of the seminar. Co-author of the report.
- 2022 **PC Member**, Conference on Lifelong Learning Agents (CoLLAs)
- 2022 Co-Organizer, Continual Learning and Emergence of Intelligent Systems: Theory and Application, Special Session, 2022 IEEE World Congress on Computational Intelligence (WCCI), International Joint Conference on Neural Networks (IJCNN)
- 2022 **Co-Organizer**, Advances in Continual Learning: beyond Catastrophic Forgetting, Special Session, 2022 IEEE International Conference on Evolving and Adaptive Intelligent Systems (EAIS)
- 2021 **PC member**, International Conference on AI for People (CAIP)
- 2021 **Technical & web chair**, Continual Learning in Computer Vision (CLVISION) workshop, CVPR 2021
- 2021 **PC** member, International Workshop on Continual Semi-Supervised learning (CSSL), IJCAI 2021
- 2021 **PC member**, *AI for People special issue*, AI & Society Journal of Culture, Knowledge and Communication, Springer

#### **Editorial Positions**

Associate Editor, Neural Processing Letters, Springer Nature

#### Reviewer service

Neural Networks, Elsevier

Transactions on Neural Networks and Learning Systems (TNNLS), IEEE

Transactions on Pattern Analysis and Machine Intelligence (TPAMI), IEEE

Machine Learning, Springer

Artificial Intelligence Review, Springer

Frontiers in Neurorobotics, Frontiers

Frontiers in Robotics and Al Human-Robot Interaction, Frontiers

National Science Centre Poland. Grant Reviewer

## Open source projects and libraries

2021-present Avalanche, Maintainer

Open-source library for continual learning

https://github.com/ContinualAI/avalanche

2022-present Continual Learning Baselines, Main maintainer

Reproducing continual learning results from popular papers with Avalanche https://github.com/ContinualAI/continual-learning-baselines

### Invited Talks and Tutorials

March 8, University of Plymouth (UK), Continual Learning lecture

2024 90-minute lecture on Continual Learning for master students and researchers of the University of Plymouth.

November 29, 3rd Artificial Intelligence for Electron Ion Collider Workshop, Catholic University of America,

2023 Washington, D.C., 1-hour tutorial titled "Continual Learning: taming non-stationary data streams" Introduction to continual learning, possibility to apply it to particle accelerators and hands-on session in Python.

March 23, Deep Continual Learning Dagstuhl Seminar, Dagstuhl, Germany, Beyond Forgetting with

2023 Continual Pre-Training

Introducing the Continual Pre-Training framework and its opportunities for the future of Continual Learning research.

September Tenth International Workshop DICE2022: Spacetime - Matter - Quantum Mechanics,

21, 2022 *University of Pisa, Physics Department, Castiglioncello*, Non Smettere Mai di Imparare: verso un'IA più umana

Talk in Italian on Continual Learning for a public audience.

May 31, 2022 **University of Verona**, *Computer Science Department*, Continual Learning: from zero to hero Introduction to Continual Learning (1 hour) and hands-on session by coding from scratch and with Avalanche a Continual Learning system learning to classify a stream of images (1 hour).

## Contributed Talks

2021 The Web Conference Workshop on Graph Benchmarks Learning (GLB)

Presenting the paper "Catastrophic Forgetting in Deep Graph Networks: an Introductory Benchmark for Graph Classification"

2021 **1st International Conference on AI for People: Towards Sustainable AI**Presenting the paper "Sustainable Artificial Intelligence through Continual Learning"

2021 European Symposium on Artificial Neural Networks (ESANN)

Presenting the paper "Continual learning with Echo State Networks"

- 2021 Continual AI Seminars
  - Presenting the paper "Continual learning for recurrent neural networks: An empirical evaluation"
- 2021 Continual AI Seminars
  - Presenting the paper "Continual Learning with Gated Incremental Memories"
- 2020 International Joint Conference on Neural Networks (IJCNN)

  Presenting the paper "Continual Learning with Gated Incremental Memories"

#### **Publications**

- A. Carta, A. Cossu, V. Lomonaco, D. Bacciu, and J. van de Weijer. "Projected Latent Distillation for Data-Agnostic Consolidation in Distributed Continual Learning". In: *currently under review*.
- A. Ceni, A. Cossu, M. Stölzle, J. Liu, C. D. Santina, C. Gallicchio, and D. Bacciu. "Random Oscillators Network for Time Series Processing". In: *To appear in AISTATS 2024*.
- A. Cossu, T. Tuytelaars, A. Carta, L. Passaro, V. Lomonaco, and D. Bacciu. "Continual Pre-Training Mitigates Forgetting in Language and Vision". In: *currently under review*.
- 2023 A. Carta, L. Pellegrini, A. Cossu, H. Hemati, and V. Lomonaco. "Avalanche: A PyTorch Library for Deep Continual Learning". In: *Journal of Machine Learning Research* 24.363 (2023), pp. 1–6.
  - A. Ceni, A. Cossu, J. Liu, M. Stölzle, C. D. Santina, C. Gallicchio, and D. Bacciu. "Randomly Coupled Oscillators for Time Series Processing". In: *ICML Workshop on New Frontiers in Learning, Control, and Dynamical Systems.* 2023.
  - A. Cossu. "Towards Real-World Data Streams for Deep Continual Learning". PhD thesis. Pisa: Scuola Normale Superiore, 2023. DOI: https://dx.doi.org/10.25429/cossu-andrea\_phd2023-07-17.
  - A. Cossu, F. Spinnato, R. Guidotti, and D. Bacciu. "A Protocol for Continual Explanation of SHAP". In: *ESANN 2023 Proceedings*. Bruges (Belgium) and online: Ciaco i6doc.com, 2023, pp. 501–506. DOI: 10.14428/esann/2023.ES2023-41.
  - H. Hemati, A. Cossu, A. Carta, J. Hurtado, L. Pellegrini, D. Bacciu, V. Lomonaco, and D. Borth. "Class-Incremental Learning with Repetition". In: *Proceedings of The 2nd Conference on Lifelong Learning Agents*. PMLR, 2023, pp. 437–455.
  - A. Soutif-Cormerais, A. Carta, A. Cossu, J. Hurtado, V. Lomonaco, J. Van de Weijer, and H. Hemati. "A Comprehensive Empirical Evaluation on Online Continual Learning". In: *Proceedings of the IEEE/CVF International Conference on Computer Vision Workshops*. 2023, pp. 3518–3528.
  - T. Tuytelaars, B. Liu, V. Lomonaco, G. van de Ven, and A. Cossu. "Deep Continual Learning (Dagstuhl Seminar 23122)". In: *Dagstuhl Reports* 13.3 (2023). Ed. by T. Tuytelaars, B. Liu, V. Lomonaco, G. van de Ven, and A. Cossu, pp. 74–91. DOI: 10.4230/DagRep.13.3.74.
- 2022 A. Carta, A. Cossu, F. Errica, and D. Bacciu. "Catastrophic Forgetting in Deep Graph Networks: A Graph Classification Benchmark". In: Frontiers in Artificial Intelligence 5 (2022). DOI: https://doi.org/10.3389/frai.2022.824655.
  - A. Carta, A. Cossu, V. Lomonaco, and D. Bacciu. "Ex-Model: Continual Learning from a Stream of Trained Models". In: 2022 IEEE/CVF Conference on Computer Vision and Pattern Recognition Workshops (CVPRW). 2022, pp. 3789–3798. DOI: 10.1109/CVPRW56347.2022.00424.
  - A. Cossu, G. Graffieti, L. Pellegrini, D. Maltoni, D. Bacciu, A. Carta, and V. Lomonaco. "Is Class-Incremental Enough for Continual Learning?" In: *Frontiers in Artificial Intelligence* 5 (2022). DOI: https://doi.org/10.3389/frai.2022.829842.

- F. Matteoni, A. Cossu, C. Gallicchio, V. Lomonaco, and D. Bacciu. "Continual Learning for Human State Monitoring". In: *ESANN 2022 Proceedings*. Bruges (Belgium) and online event: Ciaco i6doc.com, 2022, pp. 79–84. DOI: 10.14428/esann/2022.ES2022-38.
- G. Merlin, V. Lomonaco, A. Cossu, A. Carta, and D. Bacciu. "Practical Recommendations for Replay-Based Continual Learning Methods". In: *Image Analysis and Processing. ICIAP 2022 Workshops.* Ed. by P. L. Mazzeo, E. Frontoni, S. Sclaroff, and C. Distante. Lecture Notes in Computer Science. Cham: Springer International Publishing, 2022, pp. 548–559. DOI: 10.1007/978-3-031-13324-4\_47.
- A. Rosasco, A. Carta, A. Cossu, V. Lomonaco, and D. Bacciu. "Distilled Replay: Overcoming Forgetting Through Synthetic Samples". In: *Continual Semi-Supervised Learning*. Lecture Notes in Computer Science. Cham: Springer International Publishing, 2022, pp. 104–117. DOI: 10.1007/978-3-031-17587-9\_8.
- M. Sangermano, A. Carta, A. Cossu, and D. Bacciu. "Sample Condensation in Online Continual Learning". In: *2022 International Joint Conference on Neural Networks (IJCNN)*. 2022, pp. 01–08. DOI: 10.1109/IJCNN55064.2022.9892299.
- 2021 A. Carta, A. Cossu, F. Errica, and D. Bacciu. "Catastrophic Forgetting in Deep Graph Networks: An Introductory Benchmark for Graph Classification". In: *The 2021 Web Conference (WWW) Workshop on Graph Benchmarks Learning (GLB)*. 2021.
  - A. Cossu, D. Bacciu, A. Carta, C. Gallicchio, and V. Lomonaco. "Continual Learning with Echo State Networks". In: *ESANN 2021 Proceedings*. Online event (Bruges, Belgium): Ciaco-i6doc.com, 2021, pp. 275–280. DOI: 10.14428/esann/2021.ES2021–80.
  - A. Cossu, A. Carta, V. Lomonaco, and D. Bacciu. "Continual Learning for Recurrent Neural Networks: An Empirical Evaluation". In: *Neural Networks* 143 (2021), pp. 607–627. DOI: 10.1016/j.neunet.2021.07.021.
  - A. Cossu, M. Ziosi, and V. Lomonaco. "Sustainable Artificial Intelligence through Continual Learning". In: *Proceedings of the 1st International Conference on AI for People: Towards Sustainable AI*. EAI, 2021. DOI: http://dx.doi.org/10.4108/eai.20-11-2021.2314097.
  - V. Lomonaco, L. Pellegrini, A. Cossu, A. Carta, G. Graffieti, T. L. Hayes, M. De Lange, M. Masana, J. Pomponi, G. M. van de Ven, M. Mundt, Q. She, K. Cooper, J. Forest, E. Belouadah, S. Calderara, G. I. Parisi, F. Cuzzolin, A. S. Tolias, S. Scardapane, L. Antiga, S. Ahmad, A. Popescu, C. Kanan, J. van de Weijer, T. Tuytelaars, D. Bacciu, and D. Maltoni. "Avalanche: An End-to-End Library for Continual Learning". In: 2021 IEEE/CVF Conference on Computer Vision and Pattern Recognition Workshops (CVPRW). IEEE, 2021, pp. 3595–3605. DOI: 10.1109/CVPRW53098.2021.00399.
- 2020 A. Cossu, A. Carta, and D. Bacciu. "Continual Learning with Gated Incremental Memories for Sequential Data Processing". In: 2020 International Joint Conference on Neural Networks (IJCNN). 2020, pp. 1–8. DOI: 10.1109/IJCNN48605.2020.9207550.

#### Industrial collaborations

2014–2019 **R&D, partner**, KLINK, Florence, Italy

I designed and implemented the KLINK services related to network analysis and agent-based modelling and simulation. I participated in the sales activity and worked on a number of different projects based on these services for companies and organizations. In most cases, I took care of the final dissemination of the results directly to the client.

## Programming languages and frameworks

Python, Tensorflow, Keras, Pytorch, experienced user C, Java, former user

# Languages

Italian Mother tongue

English Professional knowledge

French Basic knowledge