Dominik Dold, Dr. rer. nat.

AI, neuromorphic computing, machine learning, neuroscience, physics, space

Attps://dodo47.github.io/

in https://www.linkedin.com/in/dominik-dold/

G https://scholar.google.de/citations?user=RNlSvncAAAAJ



Work experience

2021 - · · · Internal Research Fellow in AI. ESA ESTEC, Advanced Concepts Team, Noordwijk.

2020 – 2021 AI Residency Researcher. Siemens AI Lab Residency, Siemens AG, Munich.

2017 − 2018 **Visiting Researcher.** Senn group for computational neuroscience, University of Bern.

2016 − 2020 ■ Doctoral Researcher. Petrovici group for neuro-inspired AI, Heidelberg University.

Education

Dr. rer. nat., Heidelberg University, Germany.

Thesis title: Harnessing function from form: towards bio-inspired AI in neuronal substrates.

2014 − 2016 M.Sc. in Physics, Heidelberg University, Germany.

Thesis title: Stochastic Computation in Spiking Neural Networks Without Noise.

2010 − 2014 ■ **B.Sc. in Physics**, Heidelberg University, Germany. Thesis title: *Energy Conservation in Fano Spectral Line Shape Control*.

Awards and fellowships

2023 Marie Skłodowska-Curie Action Fellowship by the European Commission.

2021 Research Fellowship by the European Space Agency (ESA).

First prize in the finals of the 2019 International Collegiate Competition for Brain-Inspired Computing (ICCBC) at Tsinghua University in Beijing, China.

■ Selected and invited to participate in the first Neuro-inspired Computation Course by the International Research Center for Neurointelligence (IRCN), the University of Tokyo.

Mentoring

Supervision of postgraduate researchers

Z. Rudge. Novel Memristor-based Neural Network Accelerators for Space Applications. **PhD thesis**, co-funded via ESA's Open Space Innovation Platform.

A. Thomas. I was her project and research mentor during her time as a **Young**Graduate Trainee (YGT) at ESA (1 year position).

Supervision of graduate students

I. Walford. Novel Neural Network Architectures for Spacecraft Autonomy. Internship & Master's thesis, ESA ESTEC & University College London.

V. Caceres Chian. Towards the integration of graph neural networks into neuromorphic architectures. Master's thesis, Technical University Munich.

M. Zenk. Spatio-temporal predictions with spiking neural networks. Master's thesis, Heidelberg University.

Engagement beyond research activities

Institutional responsibilities

- 2021 − 2023 ■ Organiser of ESA's Advanced Concepts Team Science Coffee.
- 2018 − 2020 ■ Organiser of the Journal Club in my PhD research group.

Community service

- 2023 − 2024 Co-chair of the scientific committee of ESA's SPAICE conference on AI and Space, organised by ECSAT, ESA.
 - Co-organiser of the *Artificial Intelligence Application* session of the Italian Association of Aeronautics and Astronautics (AIDAA) XXVII International Congress.
 - Session moderator at the first workshop on Linguistics and Graphs for Space (LING4S), hosted at ESTEC, ESA.
 - Member of the Technical Program Committee of the International Joint Conference on Neural Networks (IJCNN)
- 2022 · · · Reviewer for the Journal *Physical Review Research* (PRR, APS physics).
 - Chair of the session *Graph Based Methods* at the International Conference for Machine Learning and Applications (ICMLA).
 - Reviewer for the International Conference on Artificial Neural Networks (ICANN).

Memberships of scientific societies

- 2023 · · · Member of the AIDAA Scientific Committee.
- 2022 · · · Member of the *International Neural Network Society (INNS)*.
- 2017 · · · Member of the Bernstein Network Computational Neuroscience.

Participation in scientific collaborations

- 2023 − 2024 Co-organizer of the GECCO 2024 Space Optimisation Competition (SPOC).
- 2022 − 2023 Co-organizer of the GECCO 2023 Space Optimisation Competition (SPOC).
- My PhD research was part of subproject (SP) 4, SP9 and co-design project (CDP) 5 of the European Commission Future and Emerging Technologies Flagship *Human Brain Project*.

Additional training and experience

- October 2022 Luiss Business School Workshop on Negotiation organized by ESA.
 - ESA Academy's Ladybird Guide to Spacecraft Operations Training Course
 - June 2020 AI@Sustainability 72h Hackathon organized by the Siemens AI Lab.
- August 2019 ■ Team communication key roles and intercultural contexts workshop.†
 - June 2019 DS³ data science summer school.

 Five-day school co-organized by the École polytechnique & the DATAIA Institute.
- February 2019 Business management course "Grundlagenwissen BWL".

Science communication

Invited talks

- Guest speaker at the UCL AI Society, University College London, UK. Title: Gazing into the future From graphs, gradients and spiking neurons to space. Invited by Miriam Jansen (events officer of the UCL AI Society).
- Talk at the MAFEX Gründungscamp AI-Day, Philipps-Universität Marburg, Germany. Title: Getting from there to here Wie durch KI die Raumschiffe von morgen aussehen könnten. Invited by Dipl.-Geogr. Astrid Bendix.
 - PhD seminar at the Observatory of the University of Vienna, Vienna, Austria. Title: Two Ways to ESA Fellowships. Invited by Prof. G. van de Ven.
 - Galaxy Coffee seminar at the MPIA, Heidelberg, Germany.

 Title: New ways of finding old globular clusters. Invited by Dr. N. Neumayer.
- Invited talk at Huawei research center, Hangzhou, China.

 Title: Deep learning and probabilistic computing in biological neural networks. Invited by Dr. Y. Chua.
 - ICCBC 2019 at Tsinghua University, Beijing, China.

 Title: Why spikes? Exploring spike-based Bayesian inference for accelerated neuronal substrates.
- **ETH Institute of Neuroinformatics**, Zurich, Switzerland.

 Title: From Euler-Lagrange to error backpropagation in cortical circuits. Invited by Prof. B. Grewe.

Conference talks

- German Aerospace Congress (DLRK), Stuttgart, Germany. Title: Modelling the European Space Sector with Knowledge Graphs.
 - AIDAA XXVII International Congress, Padua, Italy. Title: *Totimorphic structures for space application*.
- International Conference on Neuromorphic Systems (ICONS), hybrid. Title: Neuro-symbolic computing with spiking neural networks.
 - IEEE World Congress on Computational Intelligence (WCCI, IJCNN), Padua, Italy. Title: Relational representation learning with spike trains.
- 2021 IEEE International Conference on Machine Learning and Applications (ICMLA), virtual.

Title: An energy-based model for neuro-symbolic reasoning on knowledge graphs.

- International Conference on Neuromorphic Computing (ICNC), virtual. Title: Learning through structure: towards deep neuromorphic knowledge graph embeddings.
- International Joint Conference on Neural Networks (IJCNN), virtual. Title: SpikE: spike-based embeddings for multi-relational graph data.
- **Computational and Systems Neuroscience (COSYNE) Conference**, Lisbon, Portugal. Title: Lagrangian dynamics of dendritic microcircuits enables real-time backpropagation of errors.

Workshop talks

- Spiking neural networks as universal function approximators (SNUFA), virtual. Title: Spike-based embeddings for multi-relational graph data.
- Perception and attention mechanisms in the primate brain: An integrated, multi component perspective, European Institute for Theoretical Neuroscience, Paris, France. Title: Physics of perception: models of inference and learning in neuronal substrates.
 - Human Brain Project Co-Design Project 5 Meeting, Heidelberg, Germany. Title: Predictive or prospective? Real-time backprop in cortical circuits.
- Human Brain Project Subproject 9 Meeting, Bern, Switzerland.

 Title: Dendritic error backpropagation and reinforcement learning in deep cortical microcircuits.
 - Intel Neuromorphic Research Community (INRC) Workshop, Reykjavik, Iceland. Title: Real-time error backpropagation for deep cortical networks.

Science communication (continued)

▼ From Bench to Machine Learning Workshop, Institute of Advanced Studies, University of Surrey, England.

Title: From Euler-Lagrange to time-continuous error backpropagation in cortical microcircuits.

■ Human Brain Project Subproject 9 Fürberg Workshop, Fürberg, Austria.

Title: Continuous error backpropagation in cortical microcircuits from Euler- Lagrange equations.

■ From Neuroscience to Machine Learning Workshop, European Institute for Theoretical Neuroscience, Paris, France.

Title: Real-time error backpropagation for deep cortical networks.

Human Brain Project Subproject 9 Fürberg Workshop, Fürberg, Austria.

Title: Self-sustained sampling – using networks of LIF Boltzmann machines as intrinsic noise sources.

Poster presentations

Neuromorphic Algorithms Workshop (NEAL), Volpriehausen, Germany. Title: Relational representation learning with spiking neural networks.

Bernstein Conference, Berlin, Germany.

Title: An energy-based model of folded autoencoders for unsupervised learning in cortical hierarchies.

Annual Computational Neuroscience Meeting, Barcelona, Spain. Title: Lagrangian dynamics for real-time error backpropagation across cortical areas.

■ DS₃ Data Science Summer School, Paris, France. Title: Physical models of the brain – from theory to neural substrates.

■ IRCN Course in Neuro-Inspired Computation, Tokyo, Japan. Title: Function from form – two models of coding and learning in cortical circuits.

2018 **Bernstein Conference**, Berlin, Germany.

Title: Continuous learning in dendritic cortical microcircuits using Lagrangian mechanics.

■ EMBO Dendrites Workshop, Heraklion, Greece.

Title: Continuous learning in dendritic cortical microcircuits using Lagrangian mechanics.

Bernstein Conference, Göttingen, Germany.

Title: Stochastic computation on spiking neuromorphic hardware.

■ Annual Computational Neuroscience Meeting, Antwerp, Belgium. Title: *Spike-based inference with correlated noise*.

Publications

Patent applications

2022 Method and system for anomaly detection in a network.

Europe: EP4270227A1 (28/04/2022). USA: US20230353584A1 (24/04/2023). China: CN116980321A (28/04/2023).

■ Method and Device for Providing a Recommender System.

Europe: EP4231199A1 (22/02/2022). WIPO: WO2023160947A1 (30/01/2023).

2021 | Industrial device and method for building and/or processing a knowledge graph.

Europe: EP4030351A1 (18/01/2021). USA: US20220229400A1 (28/12/2021). China: CN114819049A (18/01/2022).

Neuromorphic hardware for processing a knowledge graph represented by observed triple statements and method for training a learning component.

Europe: EP4030349A1 (18/01/2021). USA: US20220230056A1 (20/12/2021). China: CN114819048A (18/01/2022).

Publications (continued)

■ Neuromorphic hardware and method for storing and/or processing a knowledge graph.

Europe: EP4030350A1 (18/01/2021). USA: US20220237441A1 (6/01/2022). China: CN114819047A (18/01/2022).

Peer-reviewed (co-)first author publications

- Differentiable graph-structured models for inverse design of lattice materials.

 Dold*, D. and Aranguren van Egmond*, D. (2023) Cell Reports Physical Science.
 - A Neuronal Least-Action Principle for Real-Time Learning in Cortical Circuits. Senn*, W., Dold*, D., Kungl, A.F., Ellenberger, B., Bengio, Y., Sacramento, J., Jordan, J. and Petrovici*, M.A. (2023). eLife.
- Neuro-symbolic computing with spiking neural networks.

 Dold, D., Soler Garrido, J., Caceres Chian, V., Hildebrandt, M. and Runkler, T. (2022).

 2022 International Conference on Neuromorphic Systems (ICONS).
 - Relational representation learning with spike trains.
 Dold, D. (2022). IEEE World Congress on Computational Intelligence (WCCI) & International Joint Conference on Neural Networks (IJCNN).
 - Evaluating the feasibility of interpretable machine learning for globular cluster detection. Dold*, D. and Fahrion*, K. (2022). Astronomy & Astrophysics (A&A), 663, 81.
- An energy-based model for neuro-symbolic reasoning on knowledge graphs.

 Dold, D. and Soler Garrido, J. (2021). 20th IEEE International Conference on Machine Learning and Applications (IEEE ICMLA).
 - Learning through structure: towards deep neuromorphic knowledge graph embeddings. Caceres Chian*, V., Hildebrandt*, M., Runkler, T. and Dold*, D. (2021). 2021 International Conference on Neuromorphic Computing (ICNC).
 - Machine learning on knowledge graphs for context-aware security monitoring. Soler Garrido*, J., **Dold***, **D.** and Frank, J. (2021). 2021 IEEE International Conference on Cyber Security and Resilience (IEEE CSR).
 - SpikE: spike-based embeddings for multi-relational graph data.

 Dold, D. and Soler Garrido, J. (2021). 2021 International Joint Conference on Neural Networks (IJCNN)
- Versatile emulation of spiking neural networks on an accelerated neuromorphic substrate.

 Billaudelle*, S., Stradmann*, Y., Schreiber*, K., Cramer*, B., Baumbach*, A., Dold*,
 D., Göltz*, J., Kungl*, A. F., Wunderlich*, T. C. et al. (2020). 2020 IEEE International Symposium on Circuits and Systems (ISCAS), Sevilla, 2020, pp. 1−5.
- Stochasticity from function why the Bayesian brain may need no noise.

 Dold*, D., I., Bytschok*, Kungl, A. F., Baumbach, A., Breitwieser, O., Schemmel, J., Meier, K. and Petrovici*, M. A. (2019). Neural Networks, 119, 200-213.

Peer-reviewed co-author publications

- Modelling the European Space Sector with Knowledge Graphs
 Berquand*, A. & Dold*, D., German Aerospace Congress (DLRK 2023).
 - Totimorphic structures for space application
 Thomas, A., Grover, J., Izzo, D., & Dold, D., XXVII Italian Association of Aeronautics and Astronautics Congress (AIDAA 2023).

Publications (continued)

- Detection, Explanation and Filtering of Cyber Attacks Combining Symbolic and Sub-Symbolic methods.

 Himmelhuber, A., Dold, D., Grimm, S., Zillner, S. and Runkler, T. (2022). Computational Intelligence In Cyber Security (IEEE CICS), IEEE Symposium Series on Computational Intelligence (IEEE SSCI 2022).
- Fast and energy-efficient neuromorphic deep learning with first-spike times.
 Göltz, J., Kriener, L., Baumbach, A., Billaudelle, S., Breitwieser, O., Cramer, B., **Dold, D.**, ... Petrovici, M. A. (2021). Nature Machine Intelligence, Volume 3.
- Accelerated physical emulation of Bayesian inference in spiking neural networks. Kungl, A. F., Schmitt, S., Klähn, J., Müller, P., Baumbach, A., **Dold, D.**, ... Kleider, M. et al. (2019). Frontiers in Neuroscience, 13, 1201.

Book chapters

- Artificial Intelligence for Space: AI4SPACE Trends, Applications, and Perspectives.

 Chapter: Neuromorphic Computing and Sensing in Space.

 Izzo*, D., Hadjiivanov*, A., Dold*, D., Meoni* and G. and Blazquez*, E., CRC Press, ISBN 9781032432441.
 - Artificial Intelligence for Space: AI4SPACE Trends, Applications, and Perspectives. Chapter: Selected Trends in Artificial Intelligence for Space Applications. Izzo, D., Meoni, G., Gomez, P., Dold, D. and Zoechbauer, A., CRC Press, ISBN 9781032432441.

* marks equal contributions