Dominik Dold, Dr. rer. nat.

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

♦ https://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. I	ESA ESTEC, Advanced Concept	s Team, Noordwijk.
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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.

2014 – 2015 Research Assistant. Evers group for theoretical quantum dynamics, MPIK Heidelberg.

Education

2016 – 2020	■ 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

- 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 under ESA's OSIP program.
- A. Thomas. I am project and research mentor for her time as a **Young Graduate**Trainee (YGT) at ESA (1 year position). Currently working on totimorphic lattice materials.

Supervision of graduate students

- I. Walford. Olfactory system as a blueprint for novel neural architectures for spacecraft autonomy. Internship, ESA ESTEC.
 - 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.

Teaching

- Teaching position, *Physics Laboratory Course for Beginners*, Heidelberg University, Germany.
- 2018 ■ Teaching assistant for the lecture *Brain-Inspired Computing*, Heidelberg University, Germany.
- Teaching position, Laboratory Courses for Medical Students, Heidelberg University, Germany.
- Teaching position, *Physics Laboratory Course for Beginners*, Heidelberg University, Germany. 2016 Teaching position, *Physics Laboratory Course for Beginners*, Heidelberg University, Germany.
- Teaching position, Medicine Beginner's Introduction Courses in Physics and Mathematics, Heidelberg University, Germany.
- Teaching position, *Physics Laboratory Course for Beginners*, Heidelberg University, Germany.
- Teaching position, *Physics Laboratory Course for Beginners*, Heidelberg University, Germany.

Engagement beyond research activities

Institutional responsibilities

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

Community service

- Co-organiser of the *Artificial Intelligence Application* session of the Italian Association of Aeronautics and Astronautics (AIDAA) XXVII International Congress.
 - Session chair 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

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

Participation in scientific collaborations

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 R 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".
- October 2018 Computational physics with GPUs.†

Additional training and experience (continued)

April 2017 ■ Machine learning in science and industry.†

† Courses offered by the Heidelberg graduate academy and graduate school for physics.

Science communication

Invited talks (7)

- 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 (6)

- 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.
- 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 (9)

- 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.

Science communication (continued)

- **Intel Neuromorphic Research Community (INRC) Workshop**, Reykjavik, Iceland. Title: *Real-time error backpropagation for deep cortical networks*.
- 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 (9)

- 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.
- 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 (5 in Germany, 3 in the US)

- Dold, D., Liu, Y., Joblin, M. and Hildebrandt, M. DE: first published in 07/2022.
 - Method and Device for Providing a Recommender System. Dold, D., Hildebrandt, M. and Mogoreanu, S. DE: first published in 03/2022.
- Industrial device and method for building and/or processing a knowledge graph. **Dold, D.** and Soler Garrido, J. DE: File No.: 21152148.9 (18/01/2021).

US: Document ID "US 20220229400 A1" (21/07/2022)

Publications (continued)

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

Dold, D. and Soler Garrido, J.

DE: File No. 21152139.8 (18/01/2021).

US: Document ID "US 20220230056 A1" (21/07/2022).

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

Dold, D. and Soler Garrido, J.

DE: File No. "21152142.2" (18/01/2021).

US: Document ID "US 20220237441 A1" (28/07/2022).

Peer-reviewed (co-)first author publications (9)

- 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.
- 2019 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 (3)

Intelligence (IEEE SSCI 2022).

- 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
- 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.

Publications (continued)

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 (2)

- AI4Space: Neuromorphic Computing and Sensing in Space.
 Izzo*, D., Hadjiivanov*, A., Dold*, D., Meoni* and G. and Blazquez*, E., CRC Press (in print).
 - AI4Space: Selected Trends in Artificial Intelligence for Space Applications. Izzo, D., Meoni, G., Gomez, P., Dold, D. and Zoechbauer, A., CRC Press (in print).

Publications in preparation (2)

- Differentiable graph-structured models for inverse design of lattice materials. Dold*, D. and Aranguren van Egmond*, D.
- A neural least action principle for real-time dendritic error backpropagation across cortical circuits. Senn*, W., Dold*, D., Kungl, A.F., Ellenberger, B., Bengio, Y., Sacramento, J., Jordan, J. and Petrovici*, M.A.

* marks equal contributions