# **CHRISTIAN PEHLE**

#### Address

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#### **Biographic Data**

Born in Darmstadt, Germany. German citizen.

#### **Education**

Heidelberg University

Heidelberg, Germany

August 2015 – February 2021 PhD in Physics

Thesis: Adjoint Equations of Spiking Neural Networks

Advisor: Karlheinz Meier<sup>†</sup>, Johannes Schemmel

November 2011 – August 2015 Diplom Mathematics (incomplete, decided to proceed with PhD instead)

finished majority of required and elective courses (among them: PDE, Optimization on Manifolds, Numerical Methods, Hodge Theory, Algebraic Topology, TQFT)

October 2010 – March 2014 MSc in Theoretical Physics (focus on Quantum Field Theory and String Theory)

October 2007 – November 2011 Vordiplom in Mathematics

October 2007 – August 2010 BSc in Physics

Edith-Stein-Schule Darmstadt, Germany

July 2007 Abitur

Recommended for German National Merit Foundation, received state-wide award for written physics exam.

# **Academic Positions & Experience**

# Kirchhoff Institute for Physics, Heidelberg University

PostDoc, STRUCTURES Excellence Cluster.

Heidelberg, Germany May 2021 - present

- · Developing theory, algorithms and software for differentiable simulation and learning in physical systems, in particular detailed neuron models and networks, integrated with the machine-learning framework JAX (in progress).
- · Developing theory and algorithms for closed-loop control of Quantum Experiments with Spiking Neural Networks (in progress).
- · Architect and developer of "Norse", a software library for machine learning with Spiking Neurons (in PyTorch).
- · Supervise students implementing event-based learning algorithms for analog Neuromorphic Hardware.

PhD student in Physics.

August 2015 - February 2021

- · Focussed on learning algorithms and plasticity in Spiking Neural Networks and analog Neuromorphic Hardware: Found a way to compute parameter gradients in networks of spiking neurons without approximations or assumptions on network topology, a long-standing open question.
- · Worked on variational approximation of quantum density matrices and certain quantum operations by artificial and Spiking Neural Networks.
- · Part of design team of a Neuromorphic Processor (BrainScaleS-2). Responsible for scale-up and verification of "plasticity processing unit" (an embedded processor with SIMD unit), evaluation and design of plasticity experiments.

# **Institute for Theoretical Physics, Heidelberg University**Master Student.

Heidelberg, Germany October 2012 - February 2014

· Developed a novel method to count massless matter in String Theory (F-Theory).

## **Selected Publications & Preprints**

**Christian Pehle**, Luca Blessing, Elias Arnold, Eric Müller, and Johannes Schemmel. Event-based backpropagation for analog neuromorphic hardware. *In preparation*, 2022

Christian Pehle and Christof Wetterich. Neuromorphic quantum computing. Phys. Rev. E, 106:045311, 2022

Benjamin Cramer, Sebastian Billaudelle, Simeon Kanya, Aron Leibfried, Andreas Grübl, Vitali Karasenko, **Christian Pehle**, Korbinian Schreiber, Yannik Stradmann, Johannes Weis, et al. Surrogate gradients for analog neuromorphic computing. *Proceedings of the National Academy of Sciences*, 119(4):e2109194119, 2022

Christian Pehle, Sebastian Billaudelle, Benjamin Cramer, Jakob Kaiser, Korbinian Schreiber, Yannik Stradmann, Johannes Weis, Aron Leibfried, Eric Müller, and Johannes Schemmel. The BrainScaleS-2 accelerated neuromorphic system with hybrid plasticity. *Frontiers in Neuroscience*, 16, 2022

Timo C Wunderlich and **Christian Pehle**. Event-based backpropagation can compute exact gradients for spiking neural networks. *Scientific Reports*, 11(1):1–17, 2021

Christian Pehle and Jens Egholm Pedersen. Norse - A deep learning library for spiking neural networks, 2021

K. Schreiber, T. C. Wunderlich, C. Pehle, M. A. Petrovici, J. Schemmel, and K. Meier. Closed-loop experiments on the brainscales-2 architecture. In *Proceedings of the Neuro-Inspired Computational Elements Workshop*, NICE '20. Association for Computing Machinery, 2020

Thomas Bohnstingl, Franz Scherr, **Christian Pehle**, Karlheinz Meier, and Wolfgang Maass. Neuromorphic hardware learns to learn. *Frontiers in neuroscience*, 13:483, 2019

Syed Ahmed Aamir, Yannik Stradmann, Paul Müller, **Christian Pehle**, Andreas Hartel, Andreas Grübl, Johannes Schemmel, and Karlheinz Meier. An accelerated lif neuronal network array for a large-scale mixed-signal neuromorphic architecture. *IEEE Transactions on Circuits and Systems I: Regular Papers*, 65(12):4299–4312, 2018

**Christian Pehle**, Karlheinz Meier, Markus Oberthaler, and Christof Wetterich. Emulating quantum computation with artificial neural networks. *arXiv*:1810.10335, 2018

Martin Bies, Christoph Mayrhofer, **Christian Pehle**, and Timo Weigand. Chow groups, Deligne cohomology and massless matter in F-theory. *arXiv preprint arXiv:1402.5144*, 2014

# **Honors & Activities**

2012	Sommerakademie Görlitz, Seminar "Quantum Hall Effect"
2011	Sommerakademie Rot an der Rot, Seminar "Knots in Mathematics and Physics"
2008	Sommerakademie Schloss Salem, Seminar "Variational Methods in Physics"
2007-2014	Studienstiftung des Deutschen Volkes (German National Merit Foundation)
2007-2014	Evangelisches Studienwerk Villigst (based on academic excellence and social involvement)
2007	Schülerpreis der Deutschen Physikalischen Gesellschaft (German Physics Society)

## **Invited Talks & Workshops**

2022	Discussion	Landan	"I accomo	fuom	Machine	I comino"	CanaCa		ah an in	Alabana 1	4.1
2023	Discussion	Leader.	Lessons	irom	wiacnine	Learning .	CaboCa	ccia work	snod in	Aignero, i	taiv.

<sup>2022</sup> Fürberg Workshop, in Fürberg, Austria.

- 2017 SP9 Fürberg Workshop, in Fürberg, Austria.
- 2016 SP9 Fürberg Workshop on Stochastic Computing, in Fürberg, Austria.
- 2016 EITN in Paris, France.

<sup>2021</sup> SNUFA Workshop (online).

<sup>2021</sup> Segev Lab Journal Club (online).

<sup>2020</sup> CNRS-Thales, NIST (online). Talk: Adjoint Equations and Spiking Neural Networks.

<sup>2019</sup> OCNS workshop on generative connectomics and plasticity in Barcelona, Spain.

<sup>2019</sup> HBP L2L (learning to learn) workshop in Fürberg, Austria.

<sup>2018</sup> HBP L2L (learning to learn) workshop in Fürberg, Austria.

# **Supervision & Teaching**

2021 – present	Co-Supervisor of two Master students.
2021 – present	Lead preparation of new teaching material for Neuromorphic Computing lab exercises.
2021	Graduate Teaching Assistant, Experimental Physics I (6-12 Students).
2017 – present	Supervised graduate students in lab exercises on Neuromorphic Computing (40+ Students).
2016	Taught Graduate Seminar: Brain Inspired Computing (6 Students).
2011 - 2012	Graduate Teaching Assistant, Linear Algebra, Heidelberg University (20-25 Students).
2009 - 2010	Teaching Assistant, Analysis, Heidelberg University (20-25 Students).

## **Research Funding**

2019 - 2020	Participated in a second compute time proposal (3.4 million core-h) at JUWELS on LTL (learning to learn):
	successfully ran multi-node and multi-gpu deep-learning experiments with Spiking Neural Networks, con-
	tributed to the final report.

- 2018 2019 Participated in a successful collaborative compute time proposal on LTL (learning to learn), which resulted in 3.4 million core-h of compute time at JUWELS (FZ Jülich), the 8th fastest supercomputer in the world (as of November 2021), with participants from 5 international research labs: participated in and presented at planning workshop, wrote proposal for sub-project, ran feasibility study and contributed to the final report.
- 2017 2018 Assisted PhD supervisor with a successful collaborative bid (EXC 2181/1-390900948, the Heidelberg STRUCTURES Excellence Cluster) for 7-10 Million Euro per year in funding: did literature review, wrote draft for section in proposal, gave presentations at planning meetings, performed initial preparatory research.

#### **Research Software Tools**

2019 – present Norse (github.com/norse/norse, > 400 stars on Github)

- · Library for gradient-based machine learning with Spiking Neural Networks in PyTorch.
- · Created initial architecture and implementation. Co-lead design and development.
- · In use by several external groups (European Space Agency, FZI & KIT Karlsruhe, KTH Stockholm).
- · Backends for neuromorphic chips (BrainScaleS-2, SpiNNaker-2) in development.

2020 – present **aestream** (*github.com/norse/aestream*)

- · Library for streaming data from event-based cameras to deep-learning models in particular spiking neural network models.
- · Provided the initial C++ implementation and interface to PyTorch.
- · In use for closed-loop robotics experiments at KTH Stockholm.

# **Impact Activities**

- 2023 Workshop on Norse at HBP Student Conference in Madrid, Spain.
- Held virtual workshop on Deep Learning with Spiking Neurons at the 5th HBP student conference (50+ participants).
- 2020 HBP Tea and Slides VII, online seminar for general scientific audience (30+ participants).
- 2017 2nd HBP Young Researchers Event in Geneva, Switzerland.

# **Training & Development**

2018	CapoCaccia workshop in Alghero, Italy.
2017	HBP CodeJam in Lausanne, Switzerland

2017 HBP CodeJam in Lausanne, Switzerland.2016 HBP CodeJam in Manchester, UK.

2016 CapoCaccia workshop in Alghero, Italy.

# Languages

German (native), English (fluent), French (basic)

## **Technical Skills**

I have seven years of experience working in a team of 5-8 hardware and 10-20 software developers and users. We practice sustainable software and hardware development principles. We have implemented an integrated software-hardware development flow, including Code Review, Continuous Integration, fully reproducible software-hardware deployment and dependency management.

- · Machine Learning: PyTorch, JAX, algorithm design, optimal control, Neural ODE, Graph Neural Networks, HPC training
- · Software Development: C/C++, Python, git, basic unix tools and environment, LATEX, Functional Programming
- Hardware Development: Digital Design, FPGA (XilinX) and ASIC development: Contributed to three successful tapeouts of two prototype and one full-scale neuromorphic processor in TSMC 65 nm. Verilog/SystemVerilog, UVM, Verilator
- · DevOps: Continuous Integration (Jenkins, Github workflows), Code Review (Gerrit), SLURM, Singularity, Spack

# **Other Interests**

Programming Language Design and Type Theory, Long Distance Hiking (300 km+), Bouldering, Downhill Skiing

#### References

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