

#### Understanding deep meta-learning

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## Curriculum Vitae

#### Education

Leiden University March 2021 - August 2023

Doctor of Philosophy (PhD) in Computer Science, Dissertation: Understanding Deep Meta-Learning

First-year diploma Computer Science

Leiden University September 2019 - February 2021

Master of Computer Science: Data Science,  $Summa\ Cum\ Laude$  Thesis: Revisiting Learned Optimizers in Few-Shot Settings

Utrecht University September 2016 - July 2019

Bachelor of Science in Artificial Intelligence, *Cum Laude* Thesis: Machine Learning in the Fight against Internet Toxicity

University of Applied Sciences Leiden September 2015 - July 2016

# List of publications

- Huisman, M., Moerland, T. M., Plaat, A., & van Rijn, J. N. (2023). Are LSTMs good few-shot learners? Machine Learning, 112, 4635–4662. Springer.
- Huisman, M., Plaat, A. & van Rijn, J. N. (2023). Subspace Adaptation Prior for Few-Shot Learning. Machine Learning. Springer.
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