## Zaccharie Ramzi | Deep Learning Postdoctoral

## researcher

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# Researcher specialized in Deep Learning and Computer Vision with excellent Technical Skills and an appetite for Research

## **Professional experiences**

CNRS - ENS Paris

Ostdoctoral researcher

In the team of Gabriel Peyré:

- Research on optimization, implicit models and unrolled models
- Participation in several open source projects, including their respective sprints: benchopt, jaxopt, ott-jax

CEA & Inria Paris
PhD Student 2019-2022

In the Parietal and Cosmostat teams, my PhD was focused on Deep Learning for MRI reconstruction.

- Designed and implemented new models for MRI reconstruction which allowed me to secure the **2nd spot in the fastMRI 2020 reconstruction challenge C** organized by Facebook and NYU. This was featured in 2 specialized press articles (CEA mag **C** and Contact **C**).
- Used the public HPC Jean Zay ♂ to train neural networks in a distributed fashion with up to 8 nodes totalling 32 GPUs while working on 1Tb of MRI data. Co-created a user's collaborative documentation ♂.
- Co-founded a lecture group focused on Deep Learning for students at NeuroSpin.
- Analyzed and benchmarked the state-of-the-art in Deep Learning for MRI reconstruction.
- Published 18 papers/abstracts in international peer-reviewed conferences/workshops/journals, among which IEEE TMI and ICLR (spotlight).
- Co-supervised 2 interns, totalling 8 months.
- Peer-reviewed 19 submissions for scientific conferences and journals.

xbird Berlin

Data scientist 2017-2019

In order to passively monitor diabetes patients, I built data pipelines, read scientific literature, specifically on human activity recognition, designed and implemented ad hoc machine learning models to efficiently detect human activities with smartphone and wearable data (GPS, accelerometer), deployed to production and maintained said models, presented research results to both tech and non-tech teams.

## **BioSerenity - Brain and Spine Institute**

Paris

2022-

Research intern April-August 2017

I benchmarked deep learning algorithms for epileptic crisis detection in EEG signals, implemented one in TensorFlow and tried several improvements.

Celmatix New-York

Data engineer and data science intern

March-September 2016

As a data engineer, I implemented data pipelines for genomic meta-analysis and deployed them to production. As a data scientist, I developed a blood hormone level model.

Ekimetrics Paris

Data science intern

August 2015-February 2016

I was in charge of the full stack development of web applications and performed data analysis on said web applications as well as on social media data.

## **Education**

#### CEA NeuroSpin & Cosmostat - INRIA Saclay Parietal team, PhD

**Paris** 

PhD in deep learning for image reconstruction

Since February 2019

The main focus of my thesis is to build an architecture that allows the reconstruction of undersampled MRI data. This led me to work in the fields of compressed sensing, optimization, computer vision, deep learning, and wavelets.

ENS Cachan, MVA Cachan

MSc in Mathematics, Vision and Learning, graduated with highest honors 2016–2017

Courses in statistical learning, optimization, graphs, graphical models, reinforcement learning, object recognition, kernel methods, text mining, bandit theory

Telecom ParisTech Paris

Engineering diploma, specialization in machine learning

2013-2017

Courses in mathematical statistics, optimization, relational databases, data mining, data visualization, introduction to machine learning

## **Technical skills**

- o My go-to programming language: Python (TensorFlow, PyTorch, Numpy, Pytest, Hydra, W&B, Jax, ...)
- My typical development environment: VS Code + Git + Jupyter notebooks
- o Programming languages I have used: Java, Scala, Ruby, Javascript, R, Matlab, Shell
- o Other tools in my stack: Docker, SLURM, LaTex, Linux, GitHub CI, Travis CI, PyPI
- o **Open source contributions:** Apple's coremitools ♂, TensorFlow ♂, scikit-image ♂, jaxopt ♂

## Open source projects

A selection of the open sources projects I took part in during my thesis. All of them are on Github.

## fastmri-reproducible-benchmark

Deep Learning for MRI reconstruction
Using the code in this repo, I secured the 2nd spot in the fastMRI 2020 brain reconstruction challenge.

#### Benchopt

Benchmarking of optimization algorithms

A meta-benchmarking tools allowing to build benchmarks for optimization algorithms in all application settings.

### TF-KB-NUFFT

Non-Uniform Fast Fourier Transform in TensorFlow

The NUFFT is essential in applications ranging from MRI to Cosmology.

 $\mathbf{O}$  tfkbnufft

#### PySap suite

Modular Optimisation, Multidisciplinary Image Processing

\(\mathbf{O}\) ModOpt, \(\mathbf{O}\) pysap-mri

## Miscellaneous

- o I was a private tutor from 2012 until 2015. I helped high school students in maths and physics.
- French is my mother tongue and I speak English at a C1 level (TOEFL: 110). I can speak a bit of conversational German.
- o I was part of a football team for 5 years, mostly during my high school years. In the process we secured the first spot in the second departmental division and got promoted to the first division.
- o I am a huge Coen Brothers and Stanley Kubrick enthusiast. More generally I love cinema, and enjoy a lot watching the web-serie *Blow up* by ARTE.

## **Publications**

- G R, C., Ramzi, Z., Ciuciu, P., "Hybrid learning of Non-Cartesian k-space trajectory and MR image reconstruction networks," Accepted as an oral to ISBI 2022, 2022, [Online]. Available: https://hal.inria.fr/hal-03394881.
- Ramzi, Z., Starck, J.-L., G R, C., Ciuciu, P., "NC-PDNet: a Density-Compensated Unrolled Network for 2D and 3D non-Cartesian MRI Reconstruction," Accepted for publication at IEEE Transactions on Medical Imaging, 2021, [Online]. Available: https://hal.inria.fr/hal-03188997.
- Farrens, S., Grigis, A., El Gueddari, L., **Ramzi, Z.**, G R, C., Starck, S., Sarthou, B., Cherkaoui, H., Ciuciu, P., Starck, J.-L., "PySAP: Python Sparse Data Analysis Package for multidisciplinary image processing," *Astronomy and Computing*, vol. 32, 2020, ISSN: 22131337. DOI: 10.1016/j.ascom.2020.100402. [Online]. Available: https://arxiv.org/abs/1910.08465.
- **Ramzi, Z.**, Remy, B., Lanusse, F., Starck, J.-L., Ciuciu, P., "Denoising Score-Matching for Uncertainty Quantification in Inverse Problems," in *NeurIPS 2020 Deep Learning and Inverse Problems workshop*, 2020. arXiv: 2011.08698. [Online]. Available: http://arxiv.org/abs/2011.08698.
- Ramzi, Z., Ciuciu, P., Starck, J.-L., "Benchmarking proximal methods acceleration enhancements for CS-acquired MR image analysis reconstruction," in *SPARS 2019 Signal Processing with Adaptive Sparse Structured Representations Workshop*, 2019. arXiv: 1807.04005. [Online]. Available: https://hal.inria.fr/hal-02298569.
- ——, "Benchmarking Deep Nets MRI Reconstruction Models on the FastMRI Publicly Available Dataset," in ISBI 2020 International Symposium on Biomedical Imaging, 2020. [Online]. Available: https://hal.inria.fr/hal-02436223.
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- ——, "Benchmarking MRI reconstruction neural networks on large public datasets," *Applied Sciences (Switzerland)*, vol. 10, no. 5, 2020, ISSN: 20763417. DOI: 10.3390/app10051816. [Online]. Available: https://www.mdpi.com/2076-3417/10/5/1816.
- **Ramzi, Z.**, Mannel, F., Bai, S., Starck, J.-L., Ciuciu, P., Moreau, T., "SHINE: SHaring the INverse Estimate from the forward pass for bi-level optimization and implicit models," in *ICLR*, **Spotlight**, 2022.
- Remy, B., Lanusse, F., **Ramzi, Z.**, Liu, J., Jeffrey, N., Starck, J.-L., "Probabilistic Mapping of Dark Matter by Neural Score Matching," in *NeurIPS 2020 Machine Learning for Physical sciences workshop*, 2020, pp. 1–6. arXiv: 2011.08271. [Online]. Available: http://arxiv.org/abs/2011.08271.
- G R, C., Ramzi, Z., Ciuciu, P., "Learning the sampling density in 2D SPARKLING MRI acquisition for optimized image reconstruction," To be presented at Eusipco 2021, 2021, [Online]. Available: https://hal.inria.fr/hal-03158831v2.
- Riemenschneider, B., Muckley, M., Radmanesh, A., Kim, S., Jeong, G., Ko, J., Jun, Y., Shin, H., Hwang, D., Mostapha, M., Arberet, S., Nickel, D., **Ramzi, Z.**, Ciuciu, P., Starck, J. L., Teuwen, J., Karkalousos, D., Zhang, C., Sriram, A., Huang, Z., Yakubova, N., Lui, Y. W., Knoll, F., "Results of the 2020 fastMRI Brain Reconstruction Challenge," in *ISMRM*, **Oral**, 2021. arXiv: 1811.08839. [Online]. Available: http://arxiv.org/abs/1811.08839.
- Ramzi, Z., Ciuciu, P., Starck, J.-L., "XPDNet for MRI Reconstruction: an application to the 2020 fastMRI challenge," in *ISMRM*, **Oral**, 2021, pp. 1–4. arXiv: 2010.07290. [Online]. Available: http://arxiv.org/abs/2010.07290.
- **Ramzi, Z.**, Vignaud, A., Starck, J.-L., Ciuciu, P., "Is good old GRAPPA dead?" In *ISMRM*, 2021, ISBN: 2106.00753v1. arXiv: 2106.00753v1. [Online]. Available: https://arxiv.org/abs/2106.00753.

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