

Photonic computing for large-scale AI applications

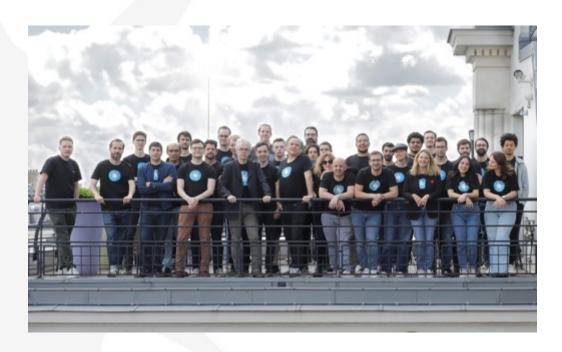
A (non-linear) entrepreneurial journey from optical computing to AI agents

Laurent DAUDET

LightOn, Co-Founder
Université Paris Cité, Professor

4 Co-founders

A team of ~45







Igor Carron

CEO

Management of complex nuclear engineering/ aerospace projects

Former Assistant Director at Spacecraft Technology Center at Texas A&M Univ.







Laurent Daudet
Expert in Signal
Processing

Physics professor at Université Paris Cité





Florent Krzakala

ML Advisor

 Professor of Physics and Electrical Engineering at EPFL





Sylvain Gigan Optics Advisor

 Physics professor at Sorbonne University



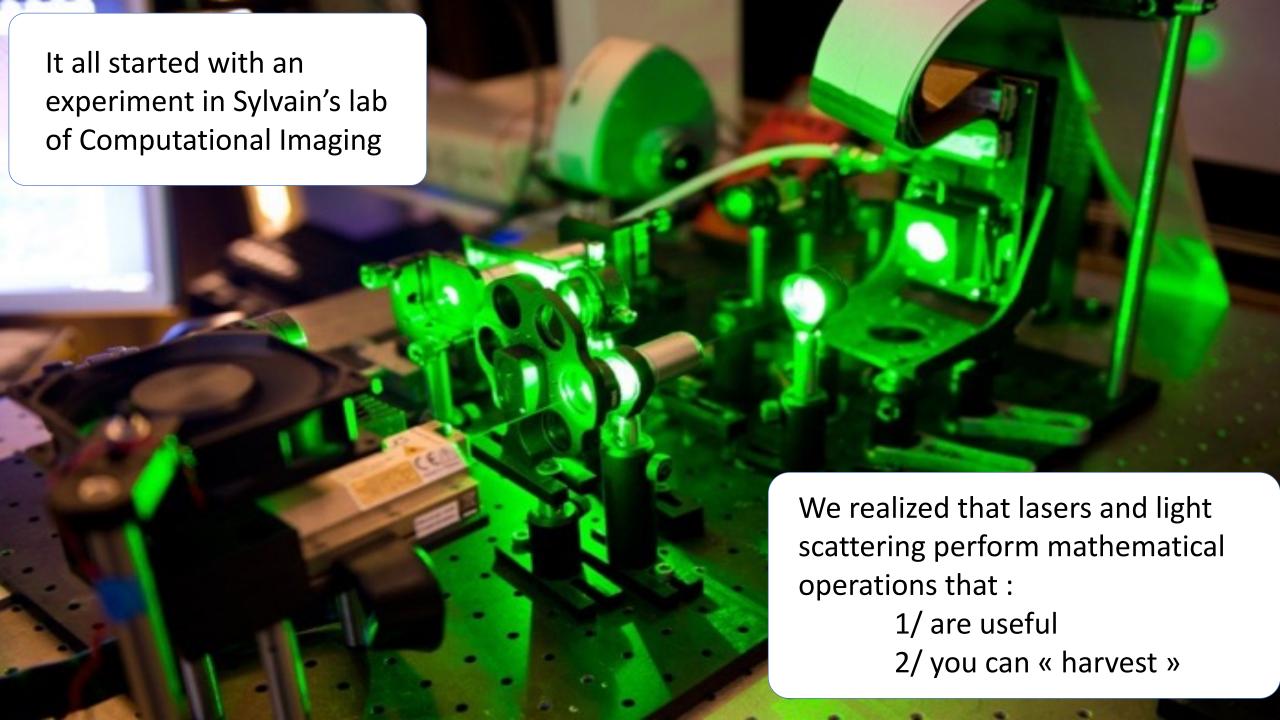
How LightOn actually started

Procrastination



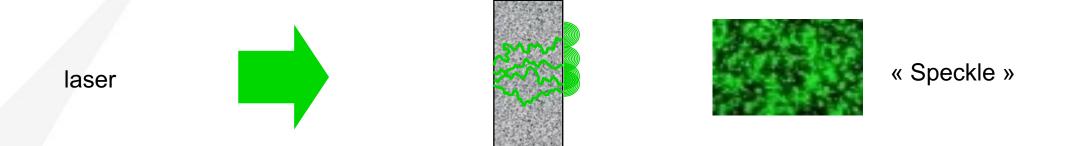
Coffee





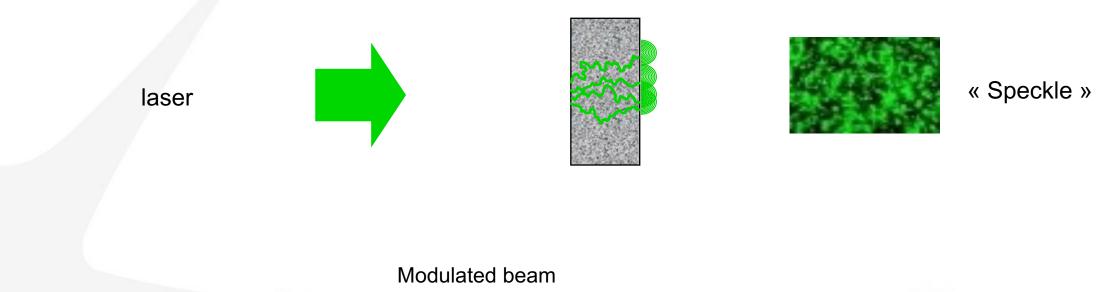
Scattering: a coherent process



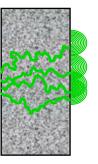


Scattering: a coherent process







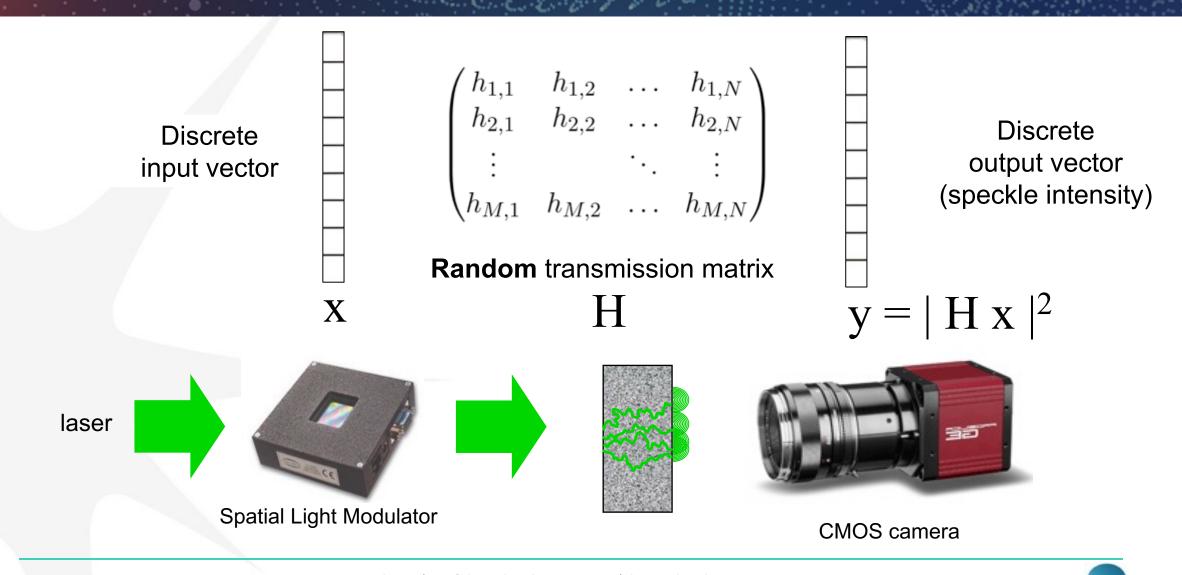




CMOS camera

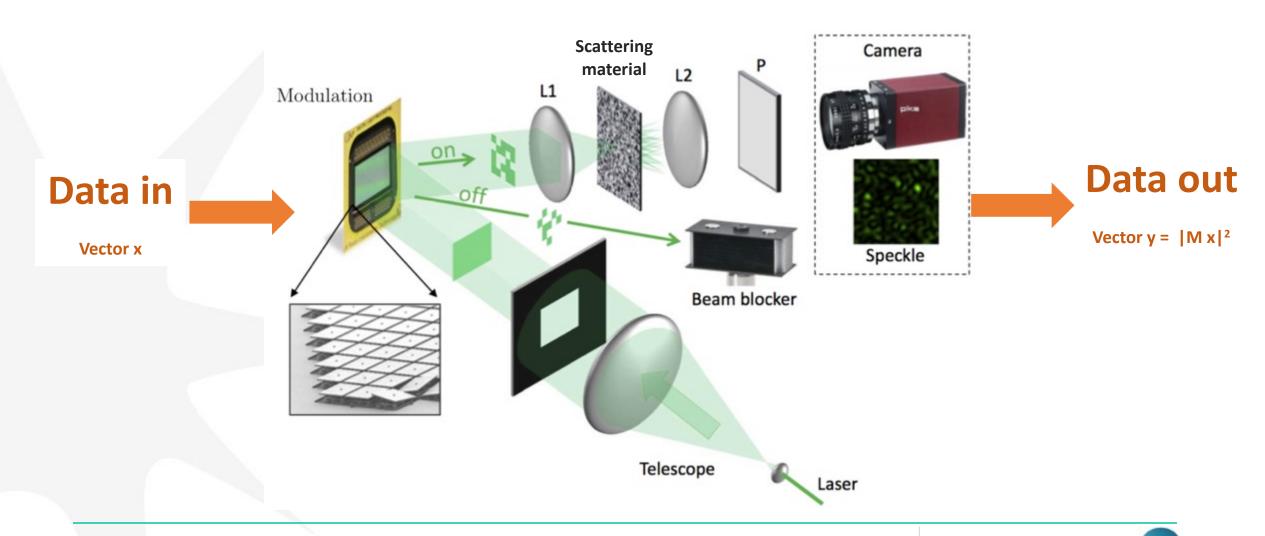
Scattering: a coherent process





Optical Processing Unit technology

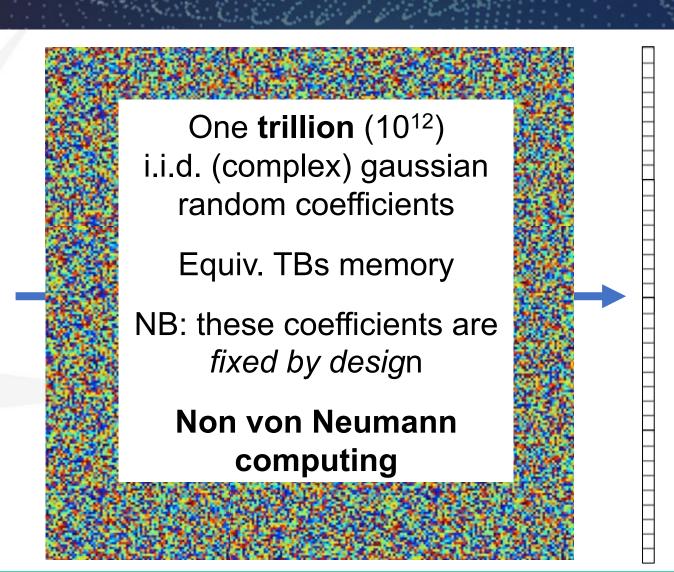




Matrix-vector multiplication through light scattering



1 million independent input pixels



1 million independent output pixels

Random Projections in Machine Learning

• Random Projections act as distance-preserving point cloud embeddings

Johnson-Lindenstrauss Lemma (1984)

Lemma For any $0 < \epsilon < 1$ and any interger n let k be a positive interger such that

$$k \ge \frac{24}{3\epsilon^2 - 2\epsilon^3} \log n$$

then for any set A of n points $\in \mathbb{R}^d$ there exists a map $f: \mathbb{R}^d \to \mathbb{R}^k$ such that for all $x_i, x_j \in A$

$$(1 - \epsilon)||x_i - x_j||^2 \le ||f(x_i) - f(x_j)||^2 \le (1 + \epsilon)||x_i - x_j||^2$$



NeurIPS 2017 Test of Time Award
 "Random Features for Large-scale Kernel Machines", Rahimi, Recht, 2008

The TRL scale



TECHNOLOGY READINESS LEVEL (TRL)



The first 4 years 2016-2020



Climbing up the TRL ladder

Lab experiment Photonic hardware

TECHNOLOGY READINESS LEVEL (TRL)



Optical Processing Unit technology



LightOn Optical Processing Unit (OPU) the world's first photonic AI co-processor publicly available

2200 TOPS

In a single photonic core

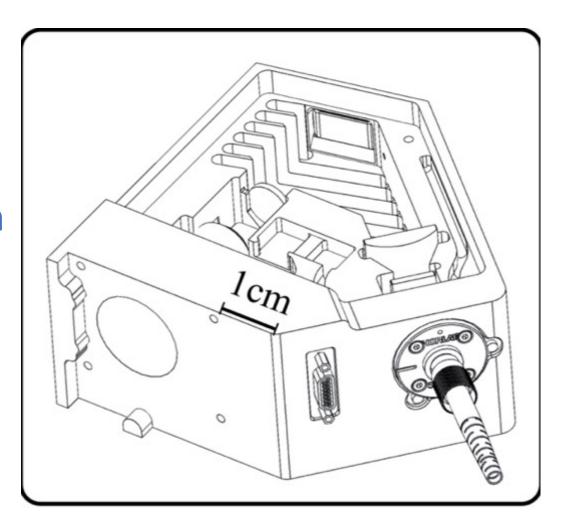
With only 30 W TDP

200 times better in #OPS/W than NVIDIA V100 GPU boards



Used by AI researchers through LightOn's cloud platform → build a community

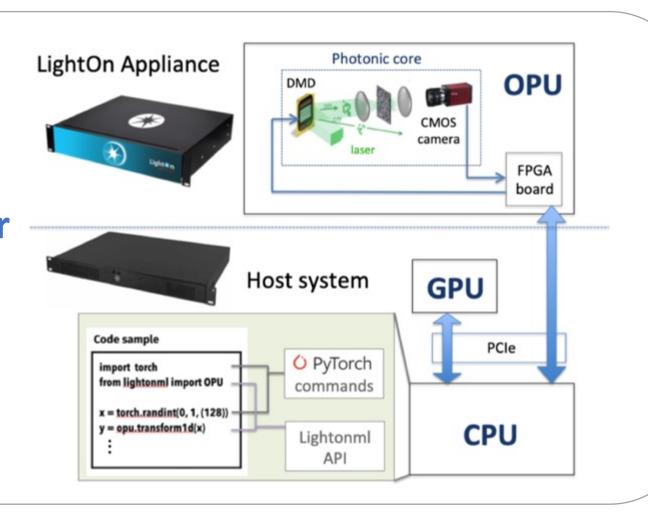
Optics integration in aluminum monobloc



Optical Processing Unit technology

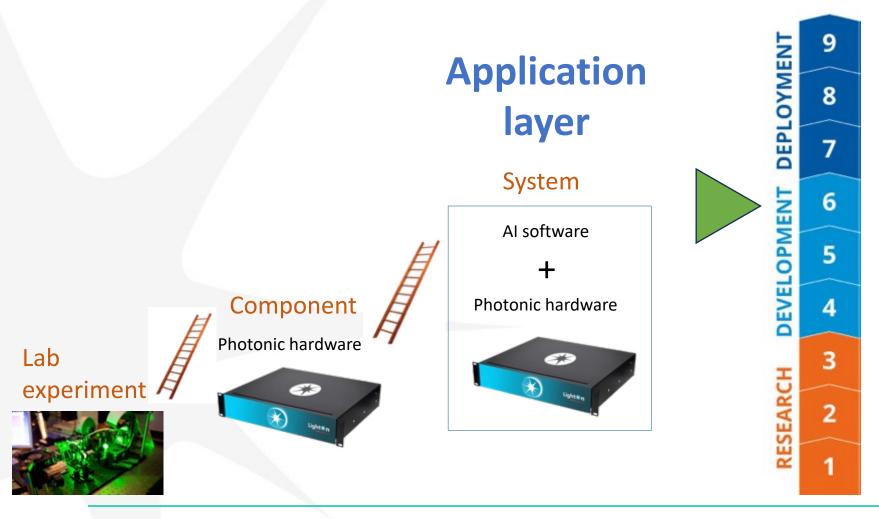


Software integration for hybrid data processing architecture



Developing applications





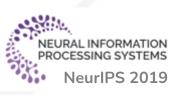
Hybrid computing in Al pipelines



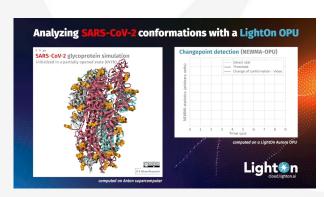












Accelerating SARS-COv2 Molecular Dynamics Studies with Optical Random Features

Amélie Chatelain LightOn ML R&D engineer



Pre-conditioning for RandSVD



Sketching for changepoint detection



Reservoir computing for time / time-space series

Transfer learning

in Convolutional Deep NN



Reinforcement Learning



Adversarial robustness / differential privacy by design







NeurIPS 2020







Collaboration with FAIR





Accelerated scientific computing with Randomized numerical linear algebra



Randomized Numerical Linear Algebra

DOE RASC report (Jan 2021): randomized algorithms are "essential to the future of computational science and AI for Science."

- Approximate matrix multiplications
- Randomized SVD
- ... And much more

Photonic co-processors in HPC: using LightOn OPUs for Randomized Numerical Linear Algebra

Daniel Hesslow, Alessandro Cappelli, Igor Carron, Laurent Daudet, Raphaël Lafargue, Kilian Müller, Ruben Ohana, Gustave Pariente, and Iacopo Poli LightOn. Paris. France.

See Hesslow D. et al, HotChips2021 proceedings, https://arxiv.org/abs/2104.14429

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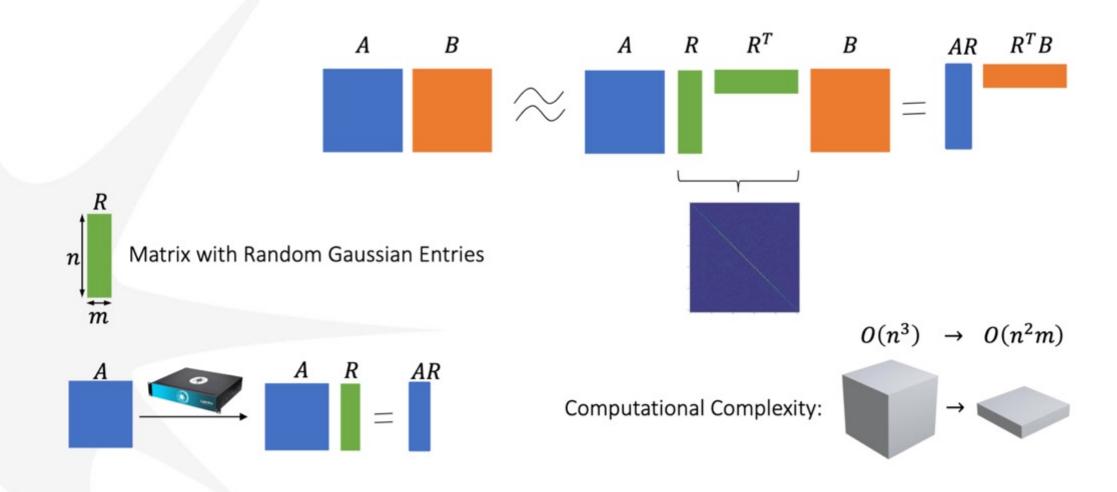
TOY EXAMPLE
Multiplying 2 matrices

NB: DON'T DO THIS IN PRACTICE!









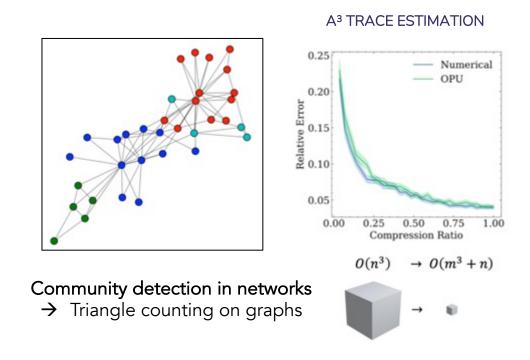


Randomized Trace estimators – application to Graph Neural Networks

Hutchinson's trace estimator

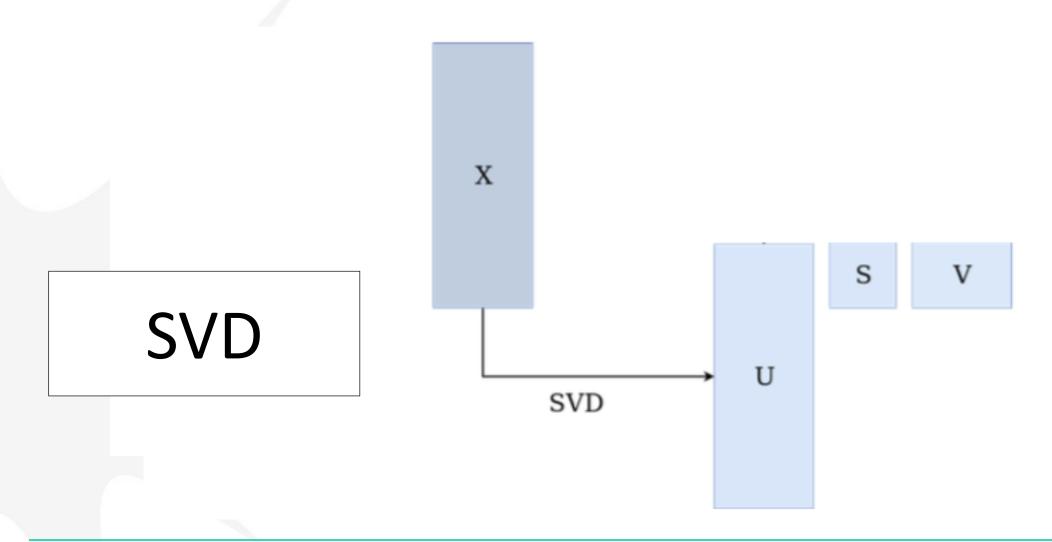
$$\operatorname{Tr}(A) \approx \operatorname{Tr}(RAR^{\top})$$

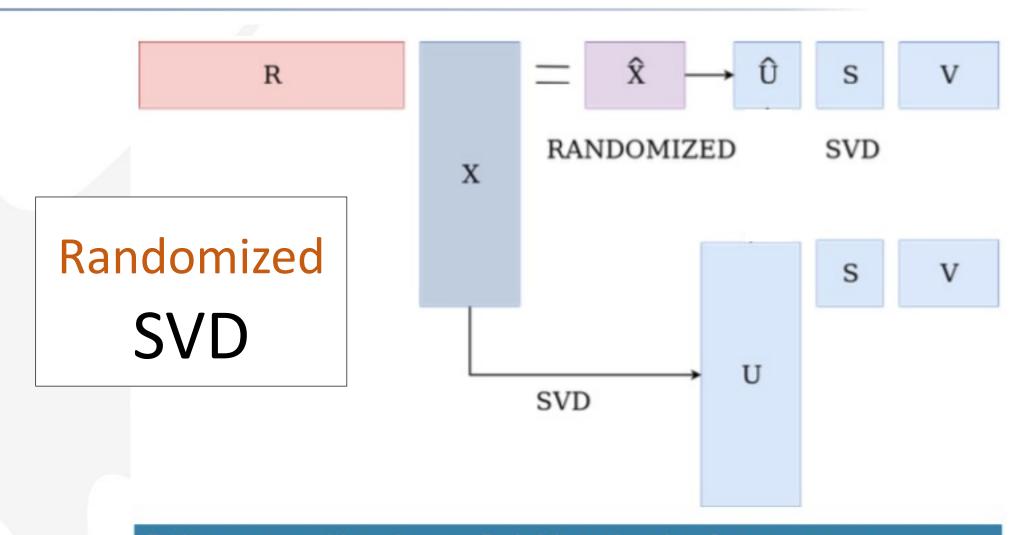
$$\operatorname{Tr}(A^3) \approx \operatorname{Tr}(RA^3R^\top) \approx \operatorname{Tr}((RAR^\top)^3)$$



(figure from Rossetti et al. Applied Network Science (2019) 4:52)



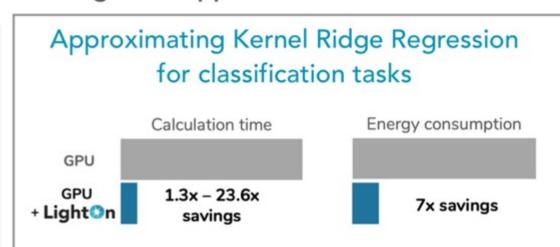




Finding structure with randomness: Probabilistic algorithms for constructing approximate matrix decompositions, Halko, N., Martinsson, P., Tropp, J., 2009, arXiv:0909.4061



LightOn Appliance for AI acceleration



Performance gains on Kernel ridge approximation for classification tasks. Dataset qm7 (quantum chemistry), high energy physics, and others. The OPU is compared to an NVIDIA P100 GPU (250 W). GPU RAM limit was hit at 32GB. Results acquired extrapolating to 1M features. OPU: Aurora 1.5 (30 W).

Real-time AI analysis of large-scale HPC results



atoms atoms

CPU FastFood NEWMA RP

Light©n 15x faster 30x faster

15x faster than FastFood on CPU at 50k atoms. For 700k + atoms, NEWMA RP on OPU is expected to be 30x faster than NEWMA FF on CPU. Library: LightOnML, Dataset: Molecular Dynamics simulations (HPC, Anton), OPU: Aurora 1.5



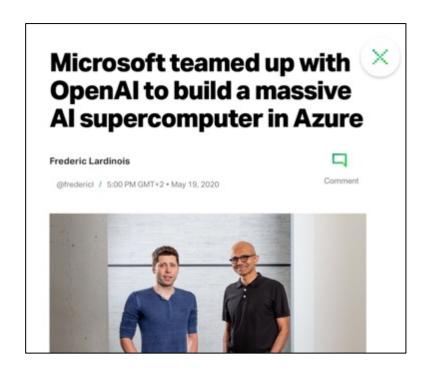
The pivot

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May 2020: supercomputer-sized Al

Training a single GPT-3 model:

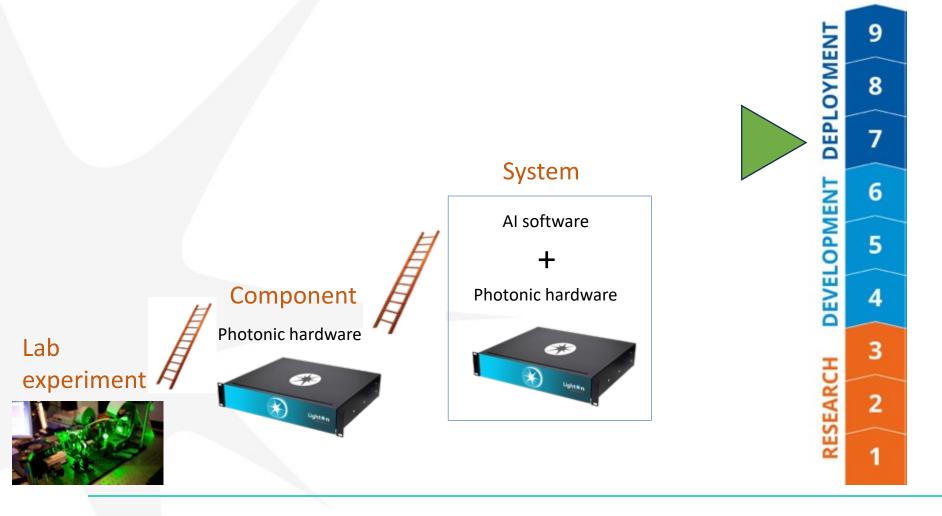
- 3 Million GPU-hours (on NVIDIA V100s)
- 550 T CO₂ equiv.
- Estimated price 5-10 M \$ for training only



Could OPU technology speed this up?

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Deploying in operational environments





we put an OPU in a #top500 supercomputer!







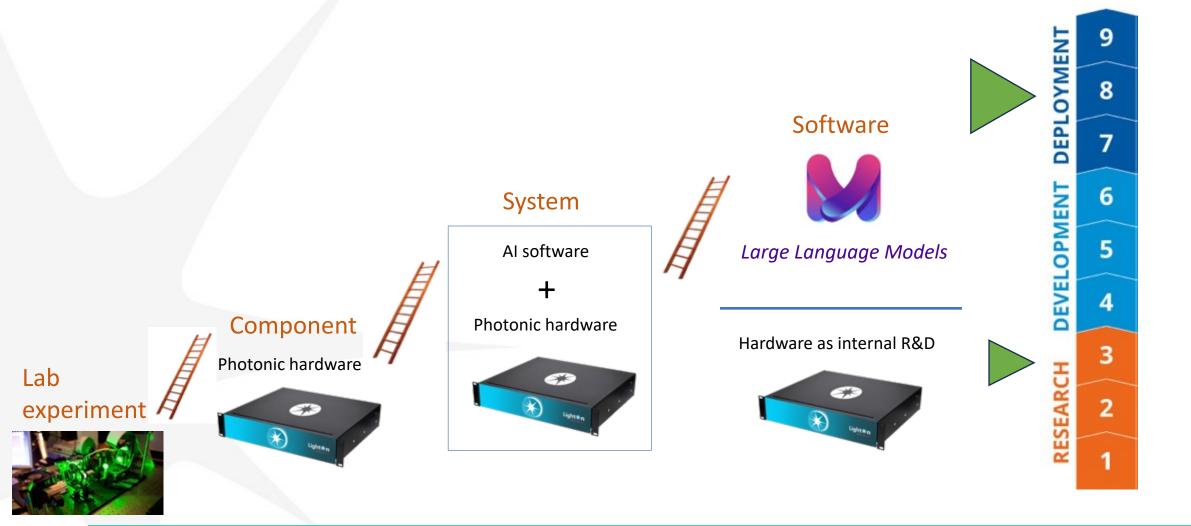
As we first learned how to train LLMs on GPUs ...

we realized there was an immediate market for it!



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2021 pivot: decoupling hardware and software





Contributions to open-source LLMs













NOOR: world's first LLM in Arabic







to build

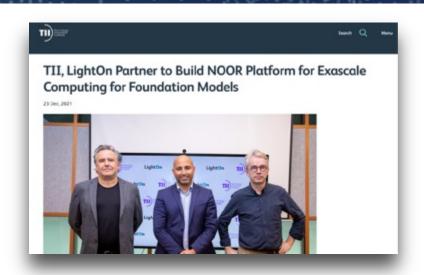


The world's first Large Language Model in Modern Standard Arabic - released 2022

Noor powered the first Al-written journal article in MSA AlEtihad News; Nov 19th, 2022



للتفاصيل:bit.ly/30IJWGG





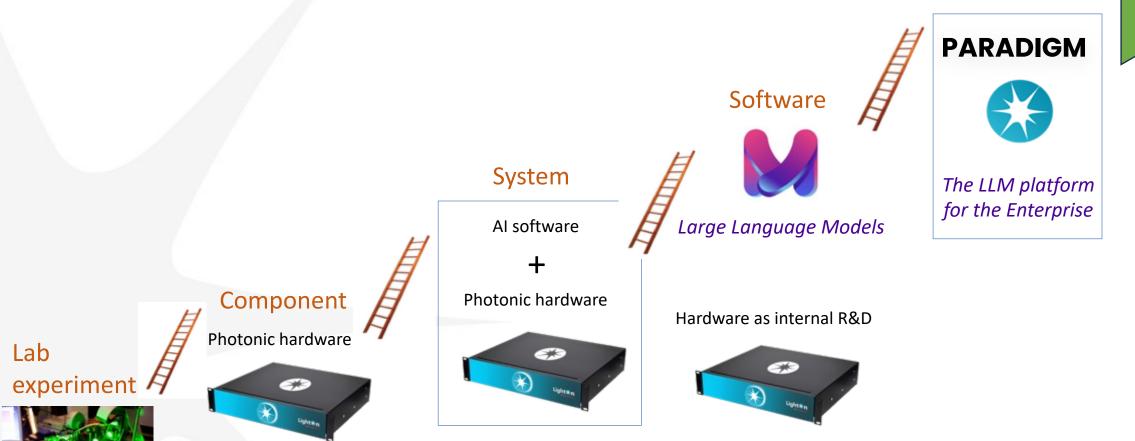
LightOn in 2025

Our mission:

turn GenAl into an enterprise-ready solution

Light₩n

Finally reaching the top!



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DEVELOPMENT

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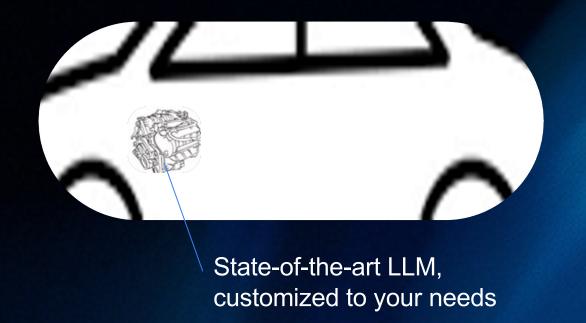
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Turn GenAl into an enterprise-ready solution:

- Safe
- Reliable
- Compliant
- Customizable
- Sustainable



Turn GenAl into an enterprise-ready solution

Enhanced RAG pipeline

SSO/ role-based access

> Compliance Audit logs

Multimodal document parsing

On-premises / private cloud with scalable inference

User interface / API

PARADIGM **



Updates management

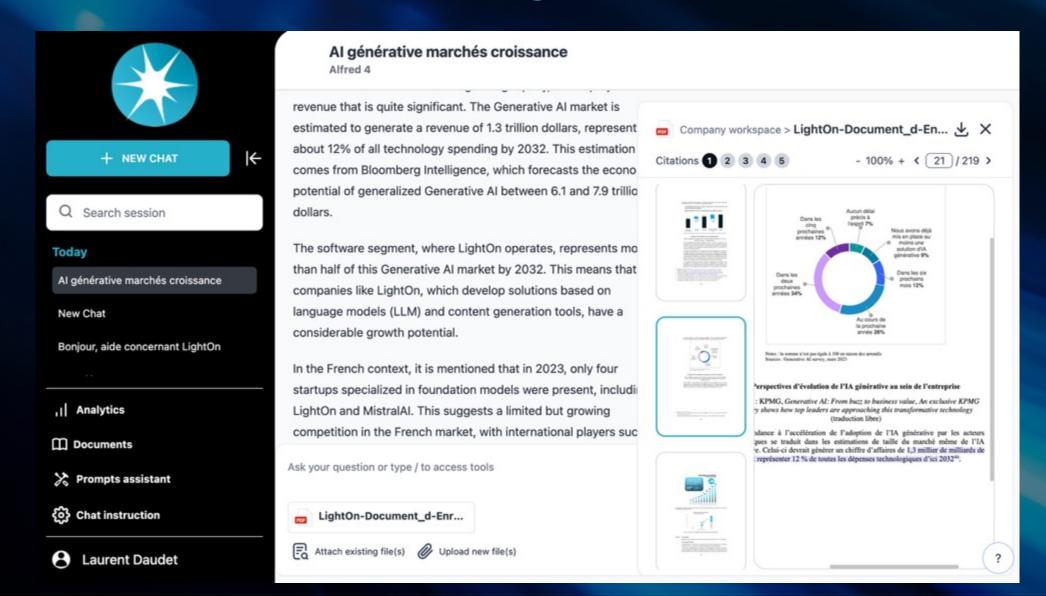
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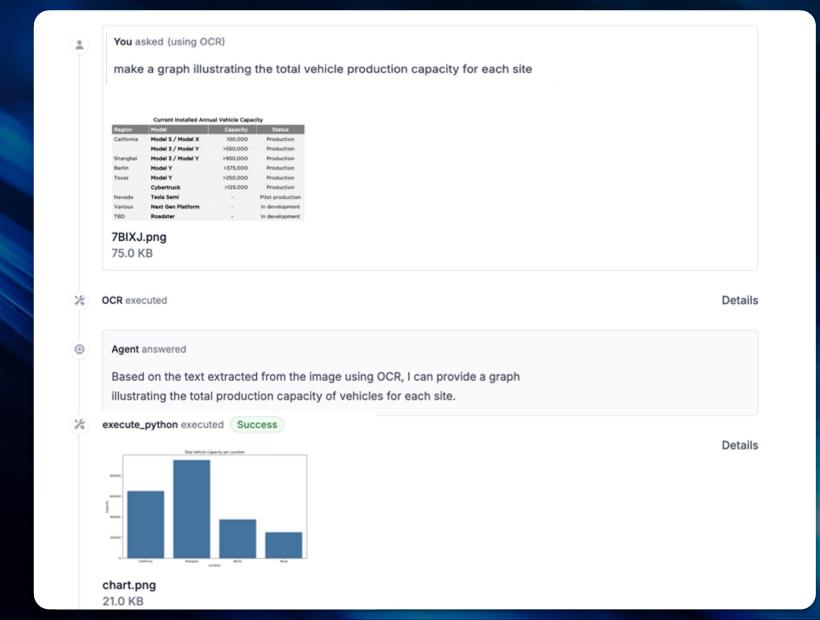
State-of-the-art LLM, customized to your needs Workflows / agents



From documents to insights



More complex workflows



This workflow calls on a range of tools

You asked (using OCR) make a graph illustrating the total vehicle production capacity for each site Current Installed Annual Vehicle Capacity Optical Character Recognition 7BIXJ.png 75.0 KB Details Agent answered Based on the text extracted from the image using OCR, I can provide a graph Python execution illustrating the total production capacity of vehicles for each site. execute_python executed Success Details chart.png 21.0 KB

One more thing...



One more thing...

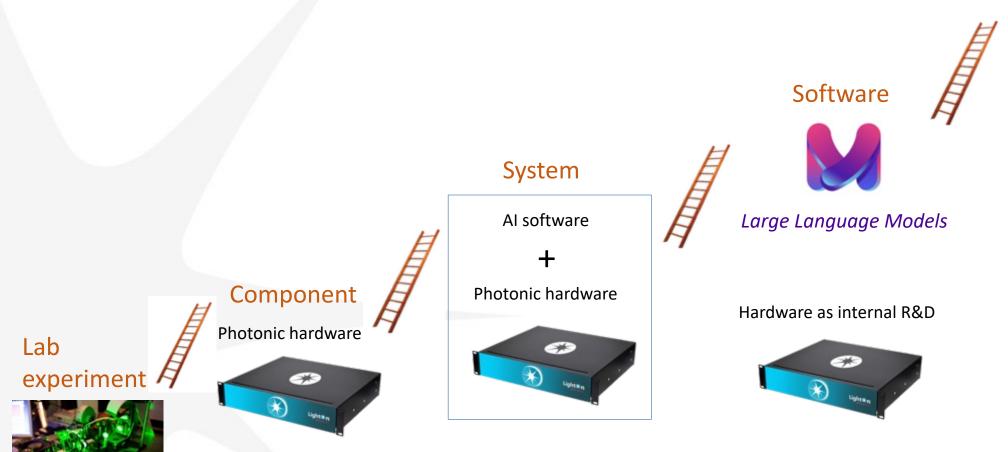
Can you use optics to train a (very) large digital model?

Wang, Muller, et al., arXiv:2409.12965(2024)



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Still plenty of interesting research questions



Platform

PARADIGM

The LLM platform for the Enterprise

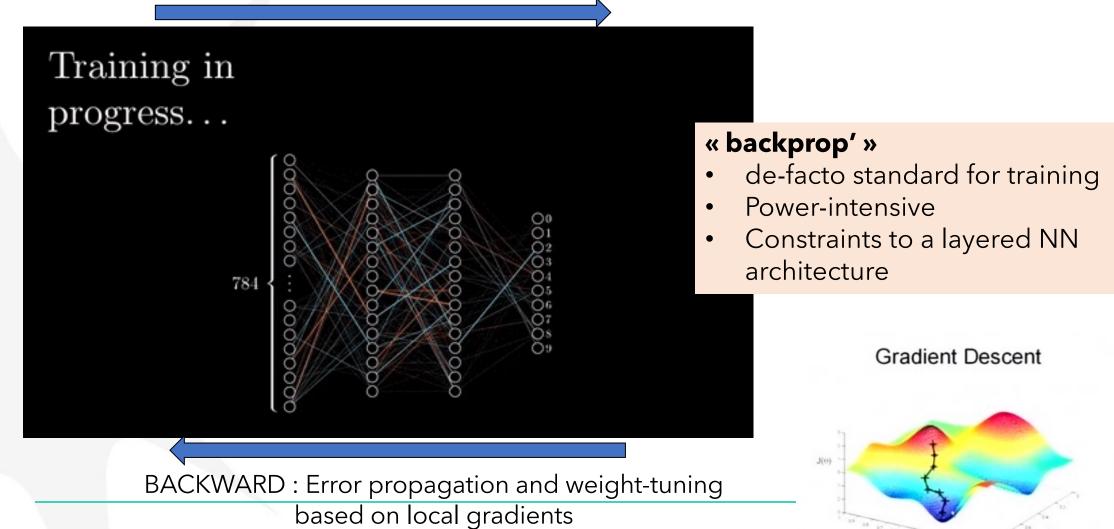


Back to

Light∰n

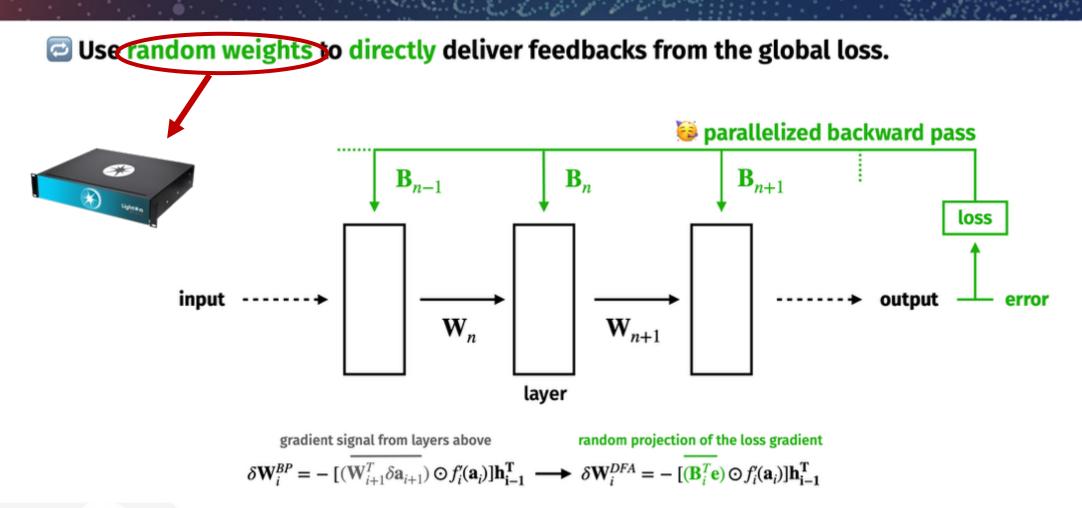
Training with backpropagation

FORWARD: inference



Training with Direct Feedback Alignment (DFA)

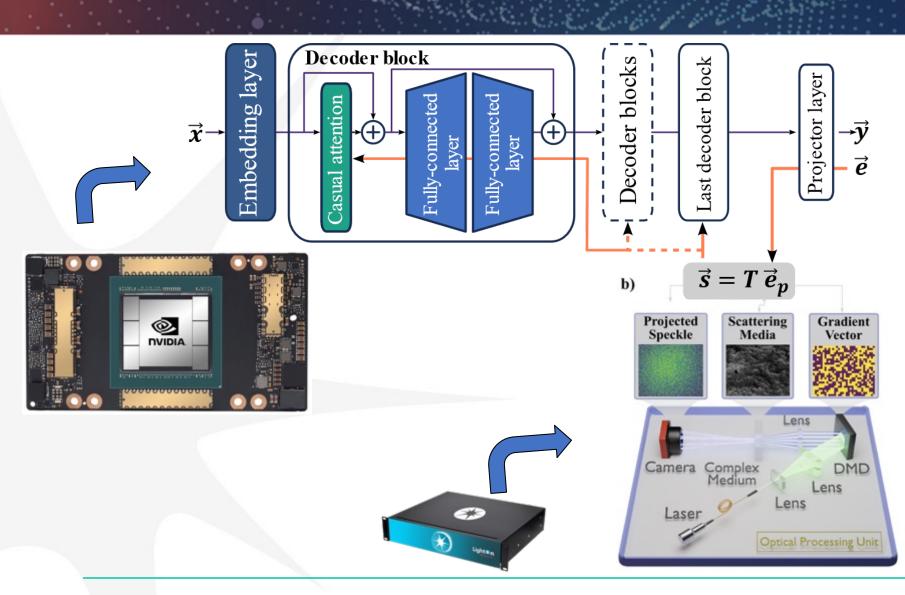




General-purpose: agnostic to model architecture & scale well

ODFA on Text Transformer





- 1B parameters GPT-like transformer
- 400M parameters directly receive optical signal

Cornell Movie-Dialogs Corpus **Example in the Dataset**

- MILES: Back at you.
- JACK: Love you, man.
- MILES: Yeah.
- JACK: So I'll see you at the rehearsal.



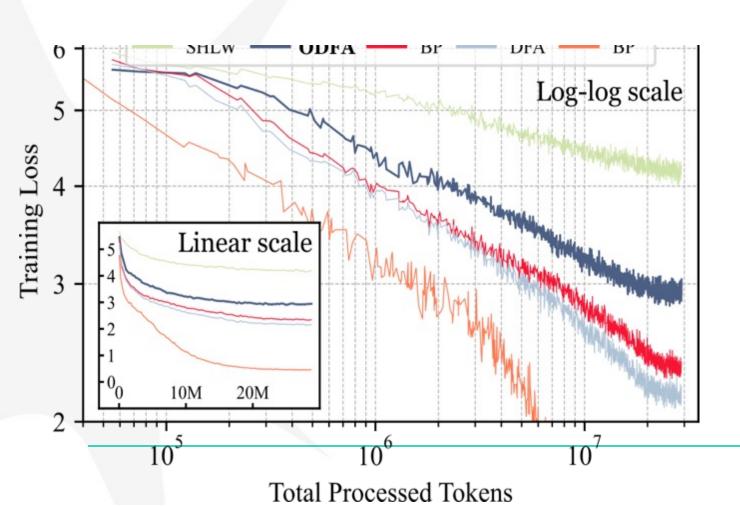
Ziao Wang (LKB)



Kilian Müller (LightOn)

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ODFA on Text Transformer: Performance

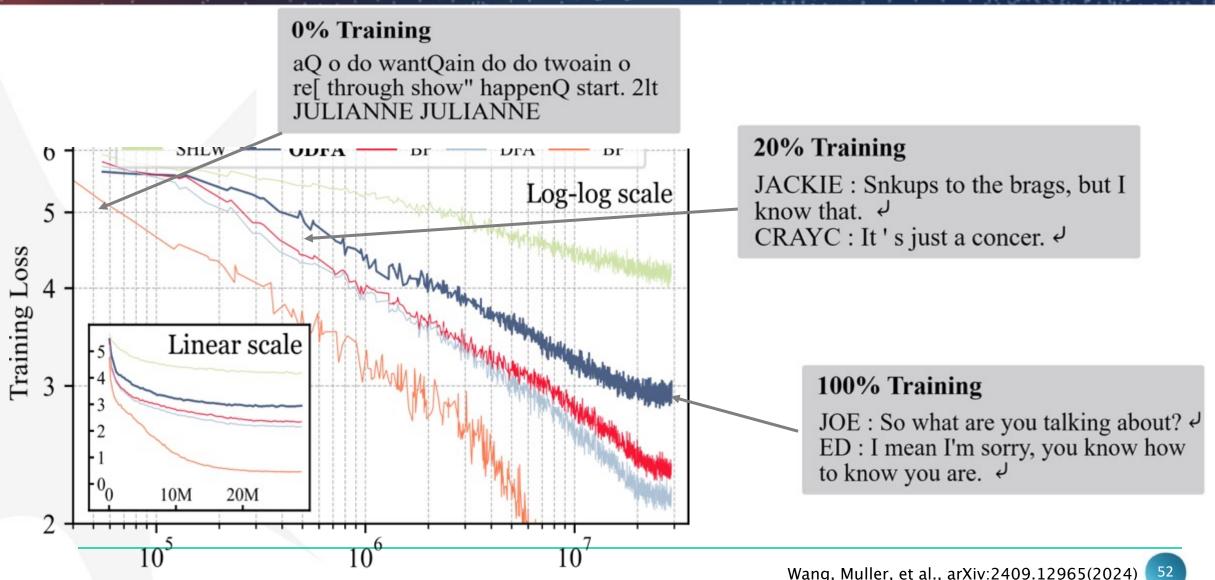


Wang, Muller, et al., arXiv:2409.12965(2024) 51

ODFA on Text Transformer: Performance

Total Processed Tokens

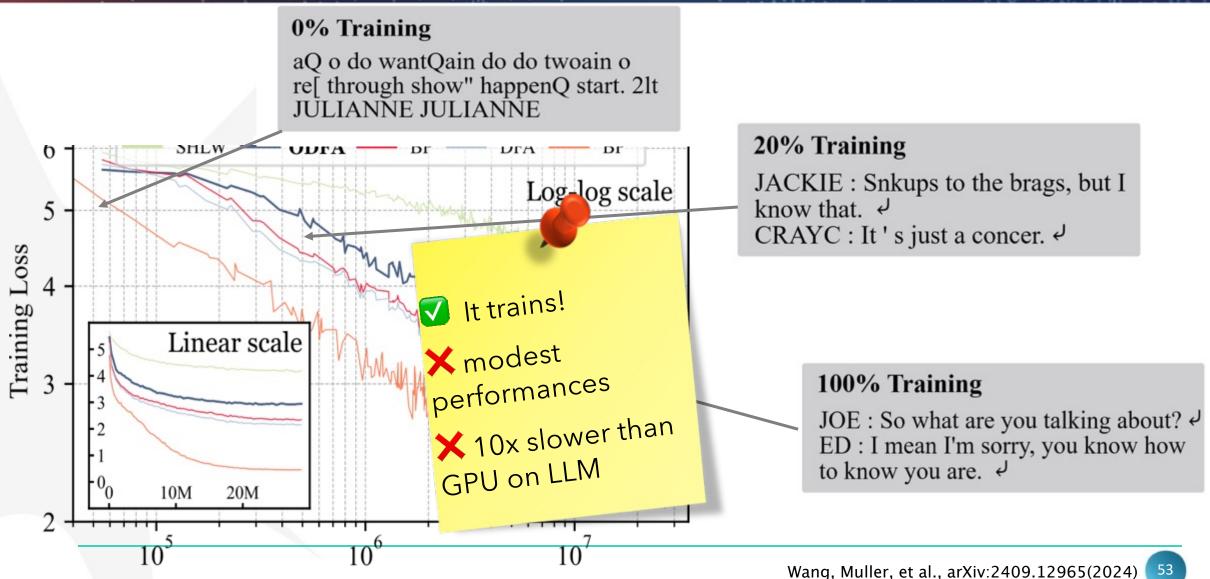




ODFA on Text Transformer: Performance

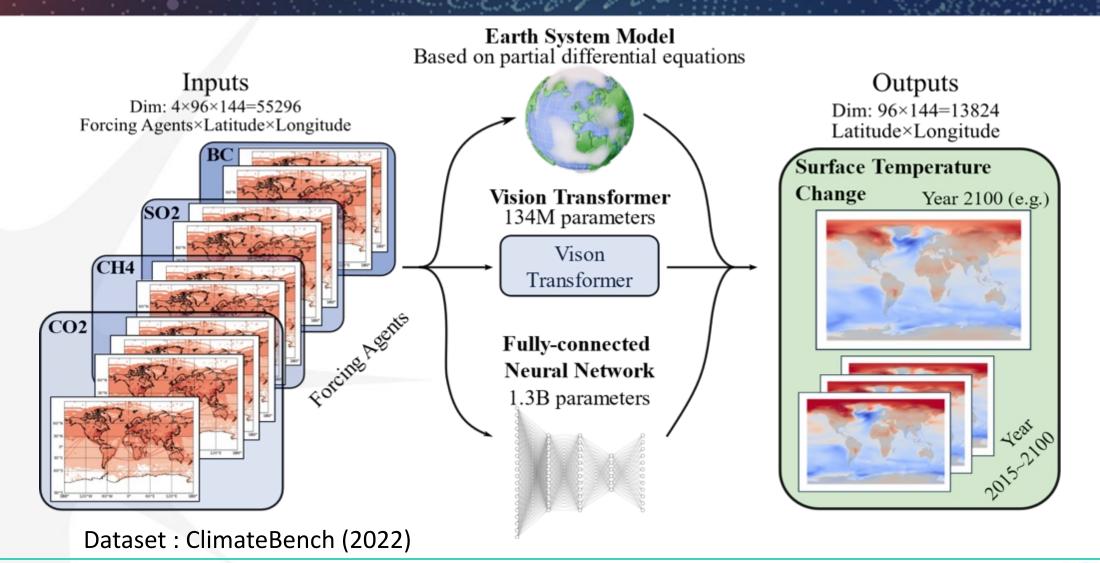
Total Processed Tokens





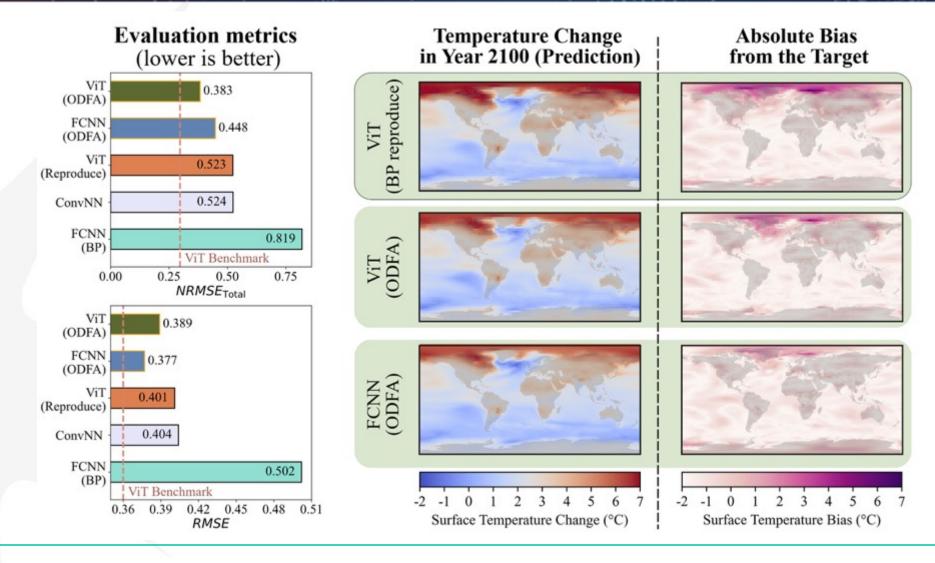
Vision Task: More Suitable for ODFA





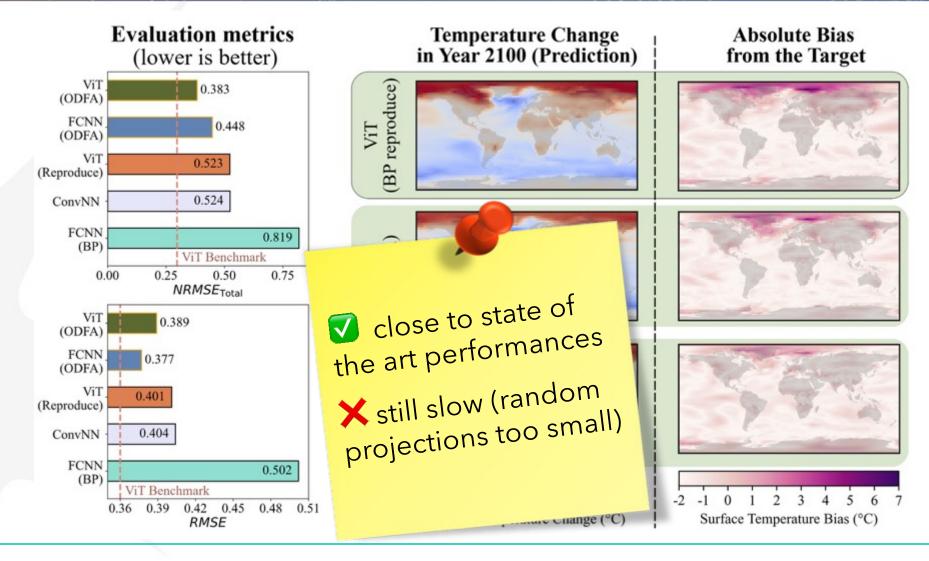
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FCNN and ViT with ODFA on Climate Projection



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FCNN and ViT with ODFA on Climate Projection



Towards Extreme Scale: When will ODFA be faster than BP?

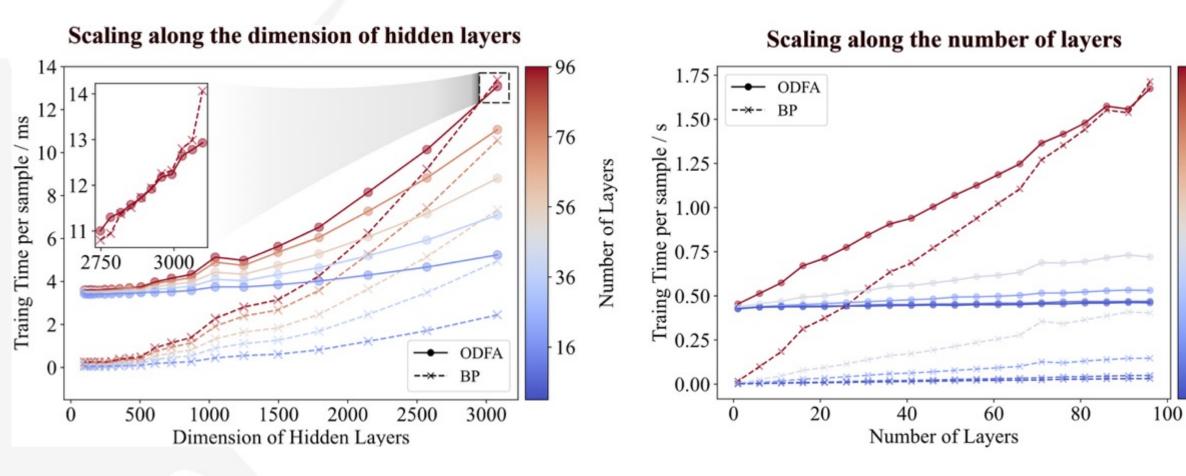


3080

252 Dimension of Hidden Layers

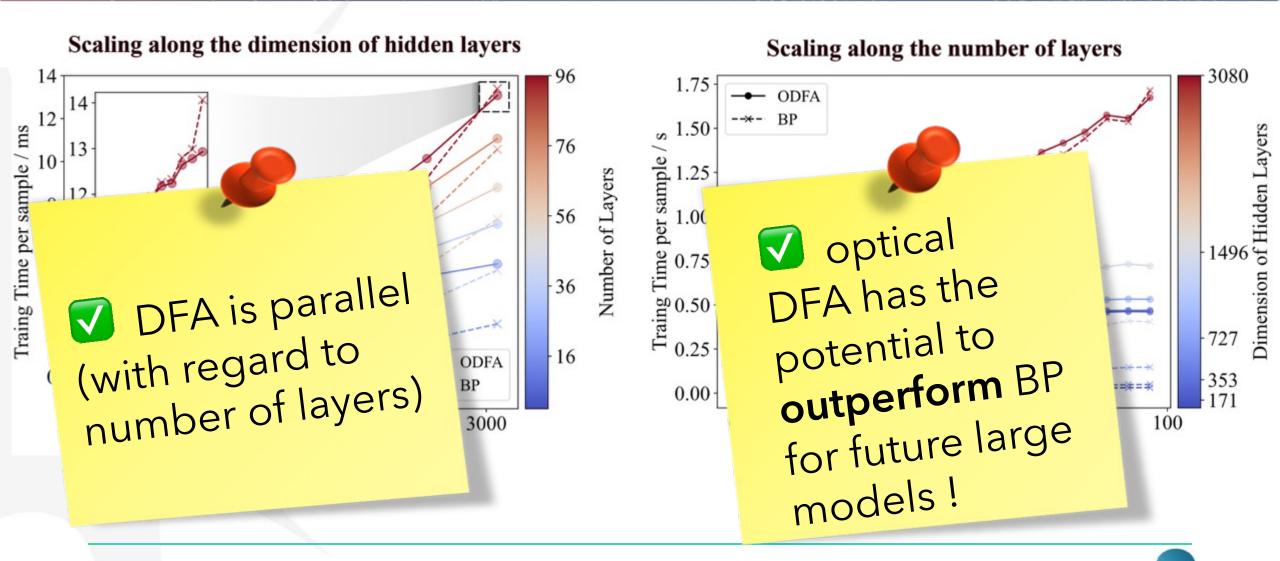
353

171



Towards Extreme Scale: When will ODFA be faster than BP?







By way of conclusion

The first publicly traded GenAl company in Europe!





The entrepreneurial journey



