Al goes MAD^2, Madrid, Spain, 15.10.2024

Towards an Artificial Muse for new Ideas in Science



Mario Krenn

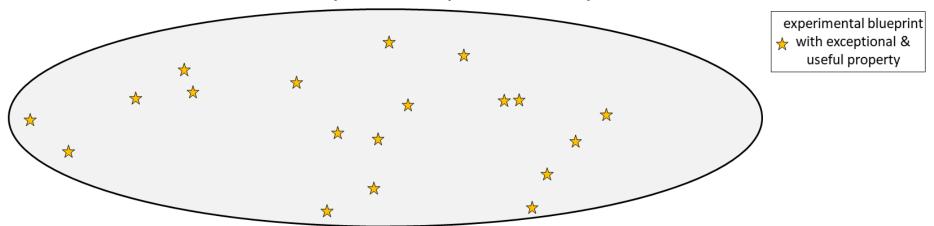
Artificial Scientist Lab, Theory Division



@mariokrenn6240

http://mariokrenn.wordpress.com/

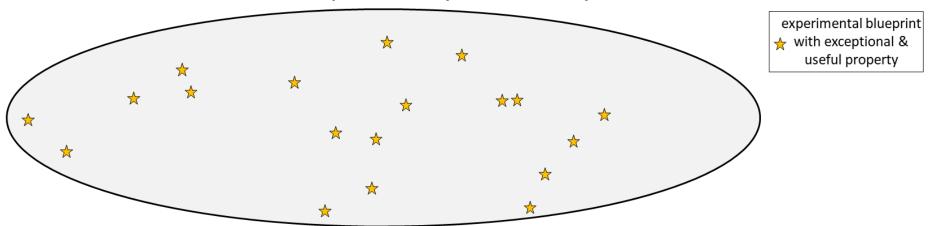




Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

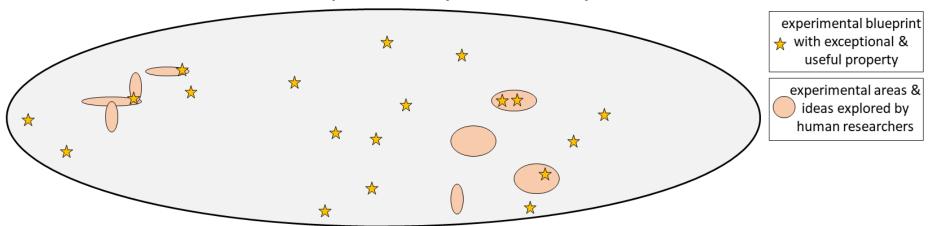
5 lasers, 5 BS, 5 detectors: 81,000 combinations (!)



Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

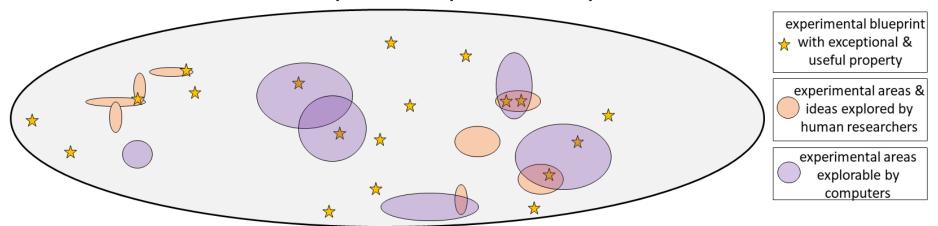
5 lasers, 5 BS, 5 detectors: 81,000 combinations (!)



Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

5 lasers, 5 BS, 5 detectors: 81,000 combinations (!)



n=2, d=2:
$$|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$$
 or or

n=2, d=2:
$$|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$$
 or or

n=3, d=2:
$$|\psi\rangle_{GHZ-2D} = \frac{1}{\sqrt{2}}(|000\rangle + |111\rangle)$$
 or or

n=2, d=2:
$$|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$$
 or or

n=3, d=2:
$$|\psi\rangle_{GHZ-2D} = \frac{1}{\sqrt{2}}(|000\rangle + |111\rangle)$$

n=2, d=3: $|\psi\rangle_{3D} = \frac{1}{\sqrt{3}}(|00\rangle + |11\rangle + |22\rangle)$
or or or

n=2, d=2:
$$|\psi\rangle = \frac{1}{\sqrt{2}}(|00\rangle + |11\rangle)$$
 or or

n=3, d=2:
$$|\psi\rangle_{GHZ-2D} = \frac{1}{\sqrt{2}}(|000\rangle + |111\rangle)$$

n=2, d=3: $|\psi\rangle_{3D} = \frac{1}{\sqrt{3}}(|00\rangle + |11\rangle + |22\rangle)$
or or or

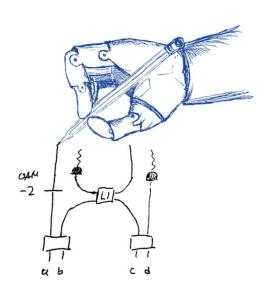
$$|\psi\rangle_{GHZ-3D} = \frac{1}{\sqrt{3}} (|000\rangle + |111\rangle + |222\rangle)$$
 or or or

High-dimensional multipartite entanglement

$$|\psi\rangle_{GHZ-3D} = \frac{1}{\sqrt{3}} (|000\rangle + |111\rangle + |222\rangle)$$
 or or or

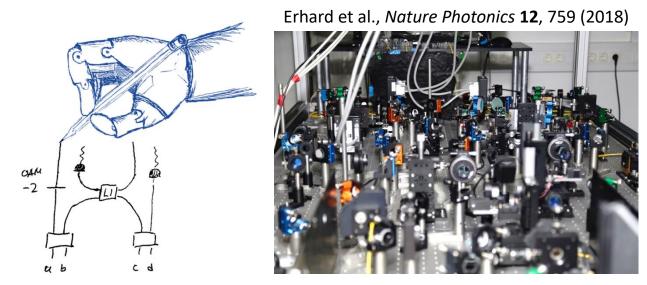
High-dimensional multipartite entanglement

$$|\psi\rangle_{GHZ-3D} = \frac{1}{\sqrt{3}} (|000\rangle + |111\rangle + |222\rangle)$$
 or or or



High-dimensional multipartite entanglement

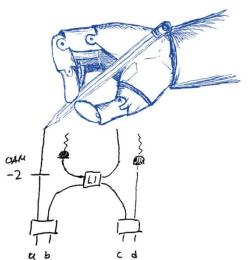
$$|\psi\rangle_{GHZ-3D} = \frac{1}{\sqrt{3}} (|000\rangle + |111\rangle + |222\rangle)$$
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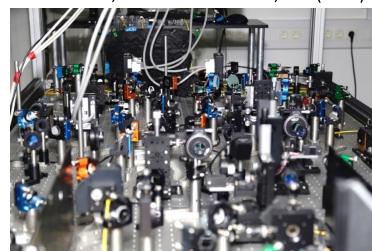
<u>Krenn</u>, Malik, Fickler, Lapkiewicz, Zeilinger, Automated Search for new Quantum Experiments, *Phys. Rev. Lett.* **116**, 090405 (2016) <u>Krenn</u>, Erhard, Zeilinger, Computer-inspired quantum experiments, *Nat.Rev.Phys* **2**, 649 (2020).

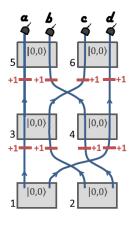
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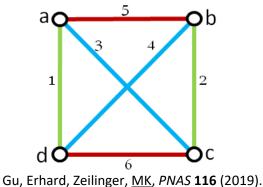


MK, Hochrainer, Lahiri, Zeilinger, Entanglement by Path Identity, *PRL* **118** (2017)

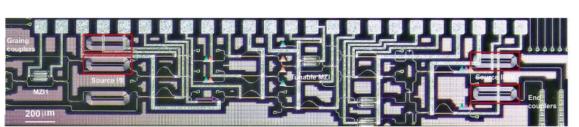
<u>Krenn</u>, Malik, Fickler, Lapkiewicz, Zeilinger, Automated Search for new Quantum Experiments, *Phys. Rev. Lett.* **116**, 090405 (2016) <u>Krenn</u>, Erhard, Zeilinger, Computer-inspired quantum experiments, *Nat.Rev.Phys* **2**, 649 (2020).

Computer-inspired ideas and concepts

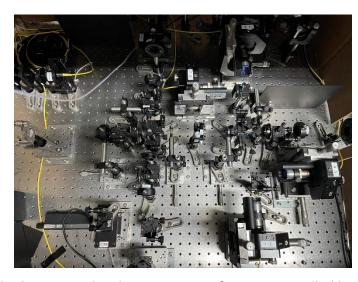
MK, Hochrainer, Lahiri, Zeilinger, Entanglement by Path Identity, *PRL* **118** (2017). MK, Erhard, Zeilinger, *Nature Reviews Physics* **2**, 649 (2020).



Bao et al., Very-large-scale integrated quantum graph photonics, Nature Photonics, 17, 573 (2023).



Feng, et al., On-Chip nonlocal quantum interference between the origins of a four-photon state, Optica (2023).



Qian et al., Multiphoton non-local quantum interference controlled by an undetected photon, Nature Communications **14** (1), 1480 (2023)

Computer-inspired ideas and concepts

MK, Hochrainer, Lahiri, Zeilinger, Entanglement by Path Identity, *PRL* **118** (2017). MK, Erhard, Zeilinger, *Nature Reviews Physics* **2**, 649 (2020).

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Phys. Scr. 95 (2020) 062501 (50pp)

https://doi.org/10.1088/1402-4896/ab7a35

Perspective



The sounds of science—a symphony for many instruments and voices

```
Gerianne Alexander <sup>1</sup>, Roland E Allen <sup>2</sup>, Anthony Atala <sup>3</sup>, Warwick P Bowen <sup>4,5</sup>, Alan A Coley <sup>6</sup>, John B Goodenough <sup>7</sup>, Mikhail I Katsnelson <sup>8</sup>, Eugene V Koonin <sup>9</sup>, Mario Krenn <sup>10,11</sup>, Lars S Madsen <sup>5</sup>, Martin Månsson <sup>12</sup>, Nicolas P Mauranyapin <sup>4</sup>, Art I Melvin <sup>10,13</sup>, Ernst Rasel <sup>14,15</sup>, Linda E Reichl <sup>16</sup>, Roman Yampolskiy <sup>17</sup>, Philip B Yasskin <sup>18</sup>, Anton Zeilinger <sup>10,13</sup> and Suzy Lidström <sup>19,20</sup>
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14. How can a computer find autonomously new, surprising or creative solutions or insights? by Mario Krenn, Art I. Melvin and Anton Zeilinger

Computer-inspired ideas and concepts

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Perspective



The sounds of science—a symphony for many instruments and voices

Chemistry Nobel 2019

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Physics Nobel 2022

14. How can a computer find autonomously new, surprising or creative solutions or insights? by Mario Krenn, Art I. Melvin and Anton Zeilinger

Mario Krenn

Highly efficient computer-designed quantum experiments

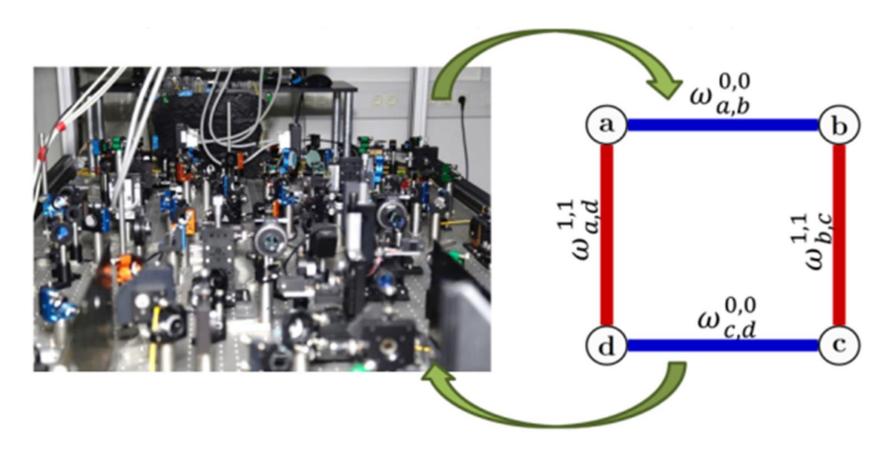
MK, Kottmann, Tischler, Aspuru-Guzik, Conceptual understanding through efficient inverse-design of quantum experiments, *Phys. Rev. X* **11**, 031044 (2021).

Highly efficient computer-designed quantum experiments

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Change Perspective:

New representation -> orders of magnitude speed-up.



Highly efficient computer-designed quantum experiments

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Change Perspective:

New representation -> orders of magnitude speed-up.

Vertex: Photonic path

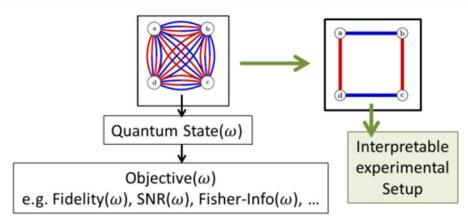
Edge: Photon pair

Edge weight: amplitude Color: Photonic Mode

 $\omega_{a,d}^{1,1}$ $\omega_{a,d}^{1,1}$ $\omega_{b,c}^{1,1}$

A) Bridge between quantum experiments and graphs

B) Gradient-based optimization + discrete topological optimization



Highly efficient computer-designed quantum experiments

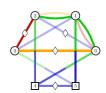
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the open journal for quantum science

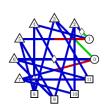
Digital Discovery of 100 diverse Quantum Experiments with PyTheus

Carlos Ruiz-Gonzalez§1, Sören Arlt§1, Jan Petermann1, Sharareh Sayyad1, Tareq Jaouni2, Ebrahim Karimi1,2, Nora Tischler3, Xuemei Gu1, and Mario Krenn1

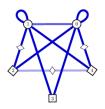
Quantum 7, 1204 (2023).



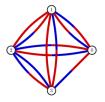
(a) Four-dimensional four-photon GHZ state (overcoming the 3-dimensional barrier for multiphoton entanglement)



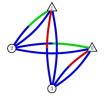
(b) Heralded 3D Bell state with single photons (improves state-of-the-art design by requiring less ancilla photons)



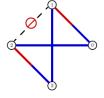
(c) Two-mode five-photon N00N state |50\rangle + |05\rangle (very symmetric shape with an inscribed pentagram)



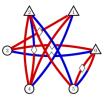
(d) A 4-qubit entangled states with unit coefficients, which requires complex-valued weights for generation



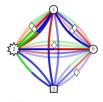
(e) Quantum measurement for a quantum communication task with quantum advantage (Mean King's Problem)



(f) Entanglement swapping without using two Bell states



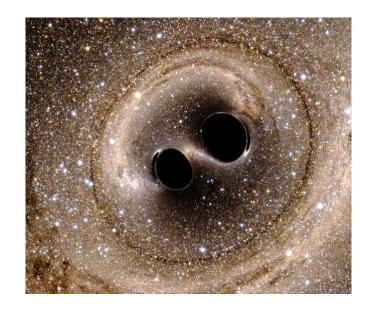
(g) Toffoli quantum gate without ancilla photons



(h) Mixed state with bound entanglement that can violate a Bell inequality (counterexample to the Peres conjecture from 1999, solved 2014)

github.com/artificial-scientist-lab/PyTheus pip install pytheusQ

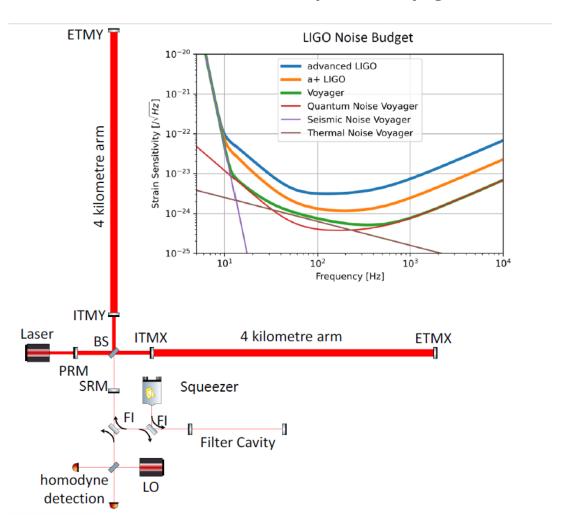
with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO): arXiv:2312.04258



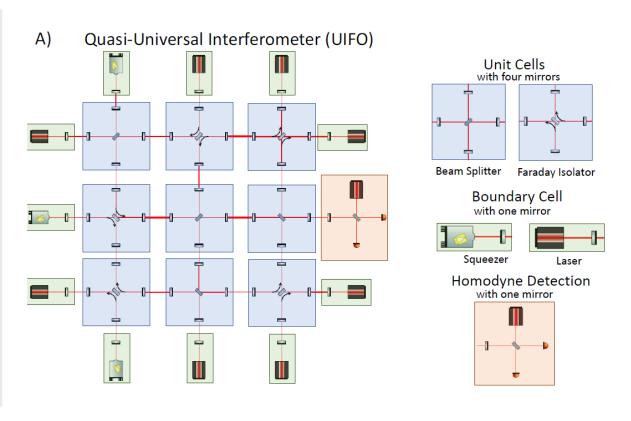


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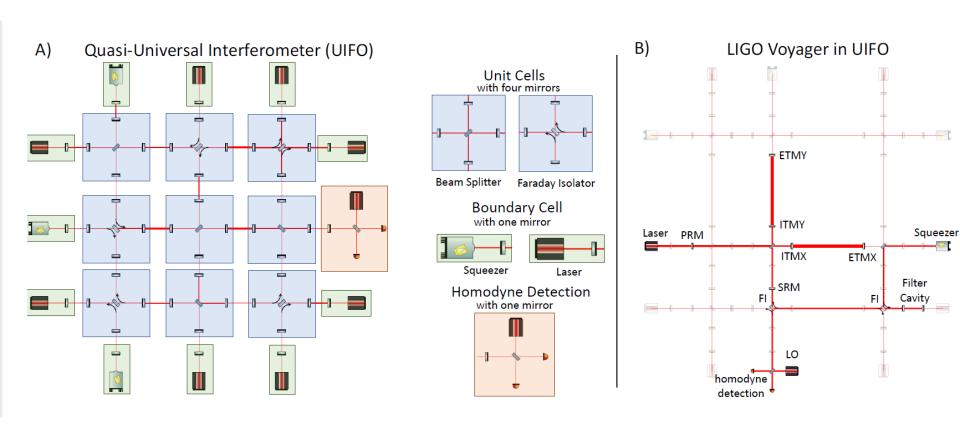
LIGO's next Generation Detector Update: Voyager



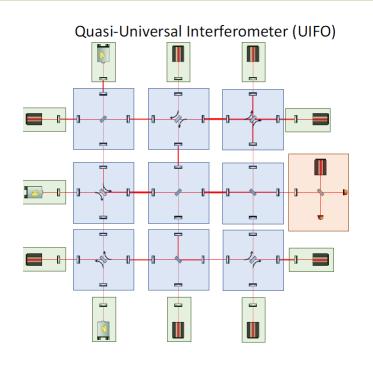
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with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO): arXiv:2312.04258



Physical Targets:

Broadband: 20Hz-5kHz

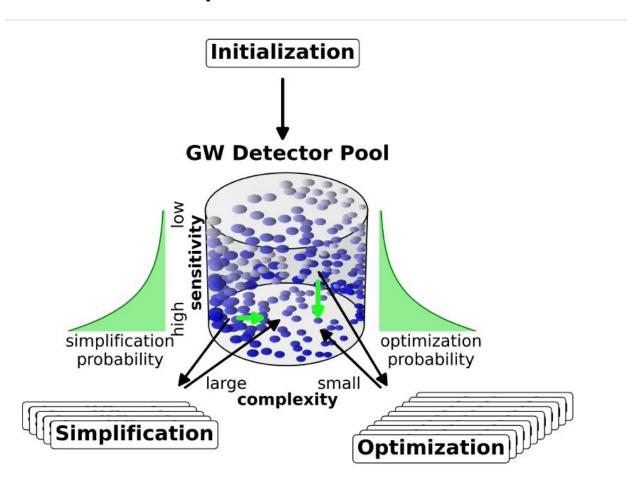
Cosmology: 10Hz-30Hz -- Terra incognita

Supernova: 200Hz-1kHz

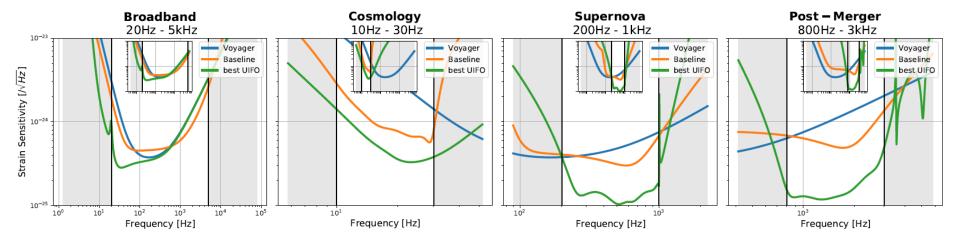
Post-Merger Analysis (Neutron Stars): 800Hz-3kHz

with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO): arXiv:2312.04258

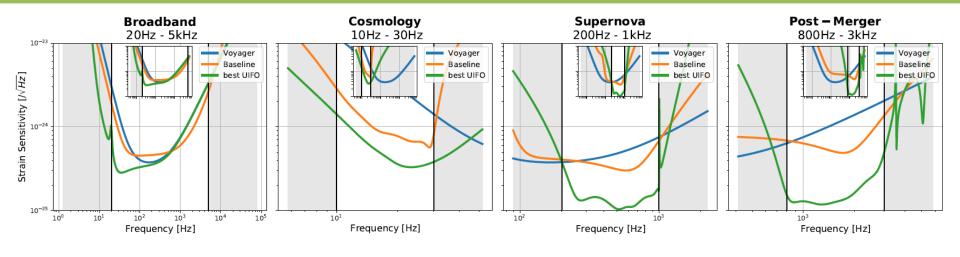
Maximization of strain sensitivity in frequency range, under realistic experimental constraints

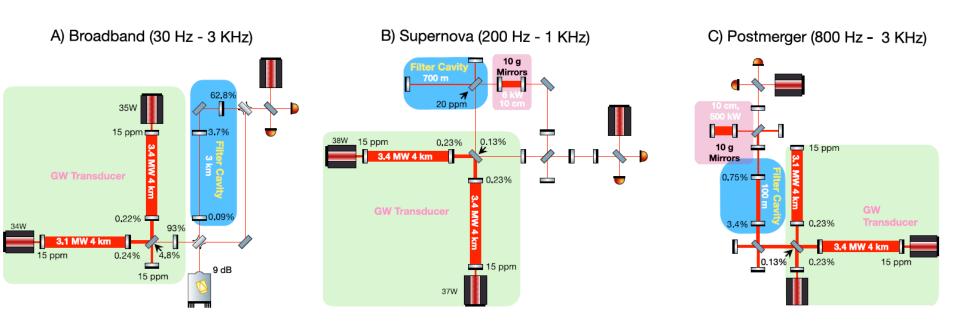


with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO): arXiv:2312.04258



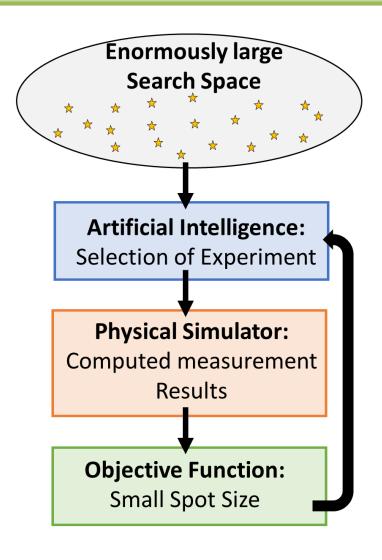
with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO): arXiv:2312.04258





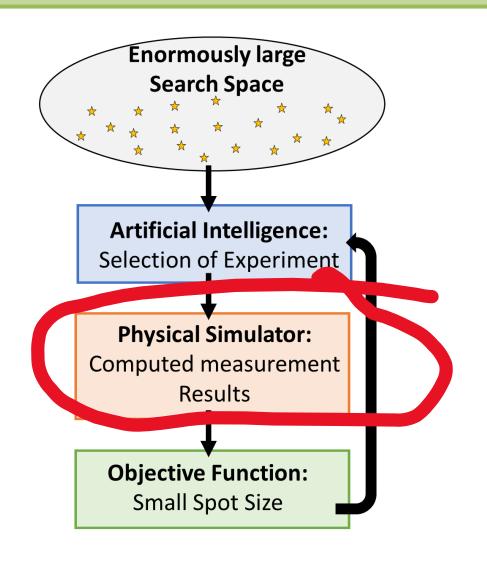
XLuminA: An Auto-differentiating Discovery Framework for Super-Resolution Microscopy

Carla Rodríguez, Sören Arlt, Leonhard Möckl, Mario Krenn - arXiv:2310.08408 github.com/artificial-scientist-lab/XLuminA/



XLuminA: An Auto-differentiating Discovery Framework for Super-Resolution Microscopy

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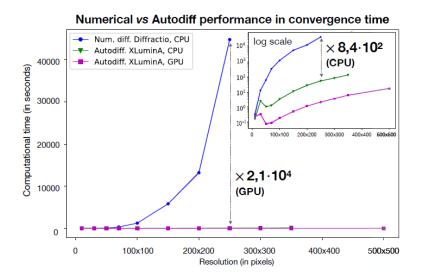
Simulator:

- Reliable
- Fast
- General

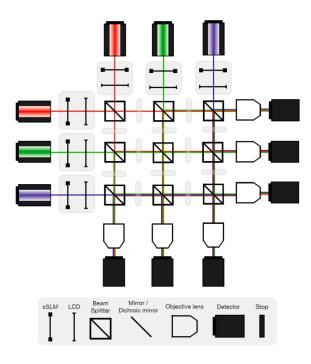
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	CPU			
	RS	CZT	VRS	VCZT
Diffractio Our approach	4.14 2.39	1.91 1.39	12.33 5.22	6.17 4.04
	GPU			
	RS	CZT	VRS	VCZT
Diffractio Our approach	$\begin{array}{c} \hline \\ 0.006 \end{array}$	0.027	$\begin{matrix}\\0.151$	$\begin{matrix} / \\ 0.075 \end{matrix}$

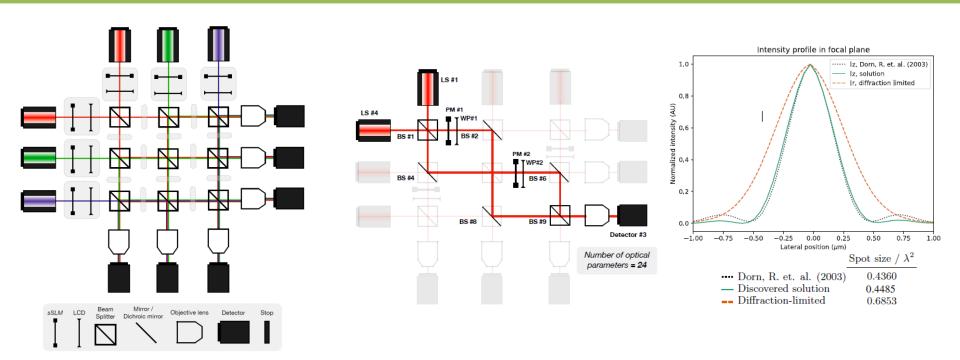


Towards Al-discovery of new super-resolution microscopy

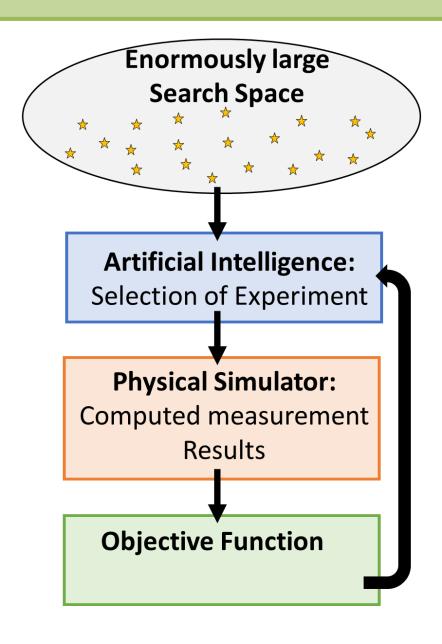


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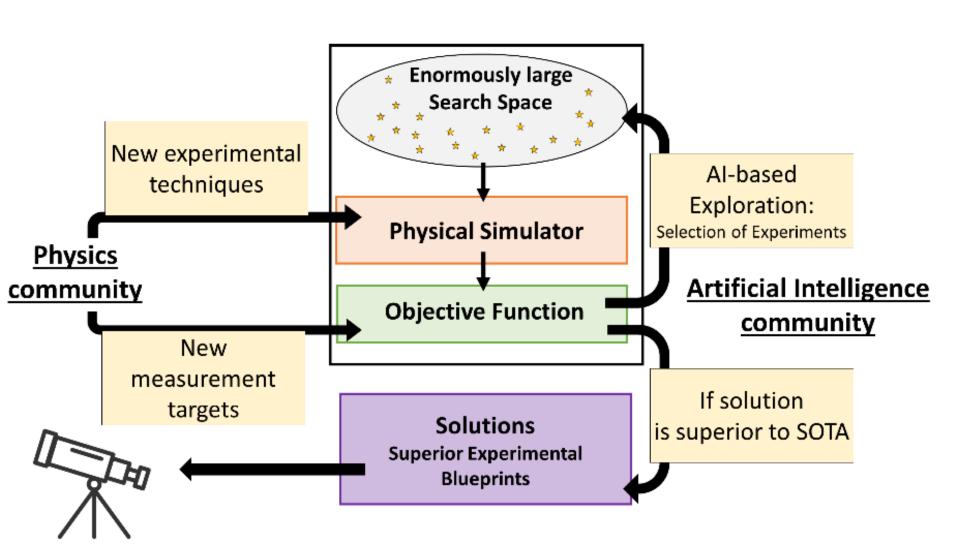
Towards Al-discovery of new super-resolution microscopy



Al-driven Design of Experiments



Al-driven Design of Experiments



Mario Krenn

Towards an artificial Muse: An artificial Source of Inspiration for Science

nature reviews physics

Perspective Published: 11 October 2022

On scientific understanding with artificial intelligence

Mario Krenn [™], Robert Pollice, Si Yue Guo, Matteo Aldeghi, Alba Cervera-Lierta, Pascal Friederich, Gabriel dos Passos Gomes, Florian Häse, Adrian Jinich, AkshatKumar Nigam, Zhenpeng Yao & Alán Aspuru-Guzik

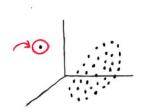
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Anomaly Detection



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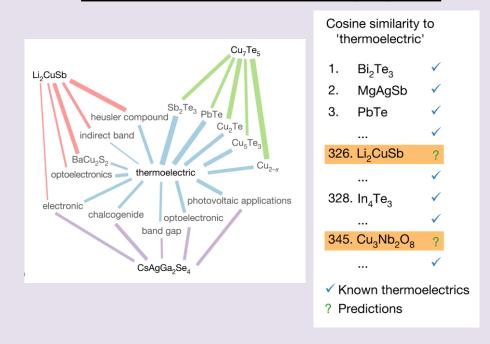
On scientific understanding with artificial intelligence



From Large Collection Of Literature



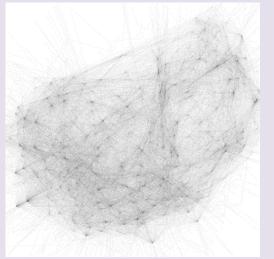
Word2Vec of 3,3mio papers



Tshitoyan, et al., *Nature* **571**, 95 (2019)

From Large Collection
Of Literature





Semantic Network of QM

from 750k papers

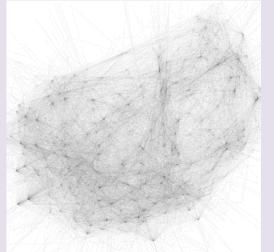
Vertices: Concepts

Edges: Co-Occurance

Krenn, Zeilinger, *PNAS* **117**, 1910 (2020) Krenn et al., *Nat. Mach. Intell.* (2023)

From Large Collection
Of Literature



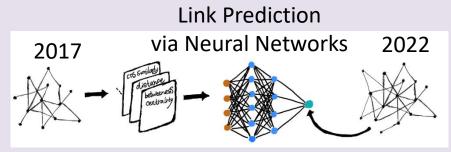


Semantic Network of QM

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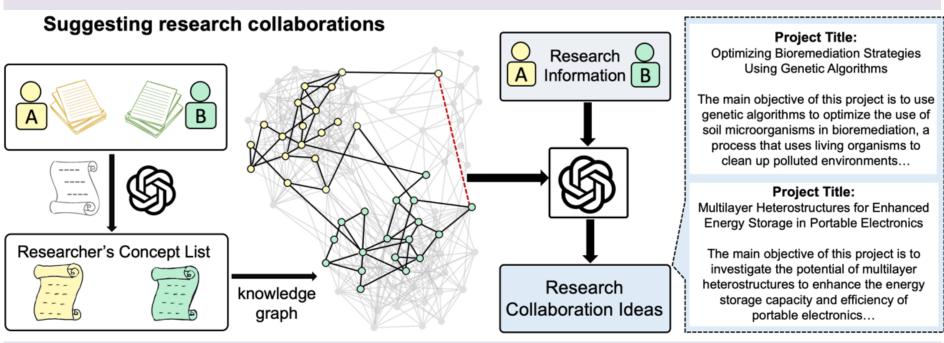


Then: From 2022 to 2027!

Krenn, Zeilinger, *PNAS* **117**, 1910 (2020) Krenn et al., *Nat. Mach. Intell.* (2023)

From Large Collection Of Literature





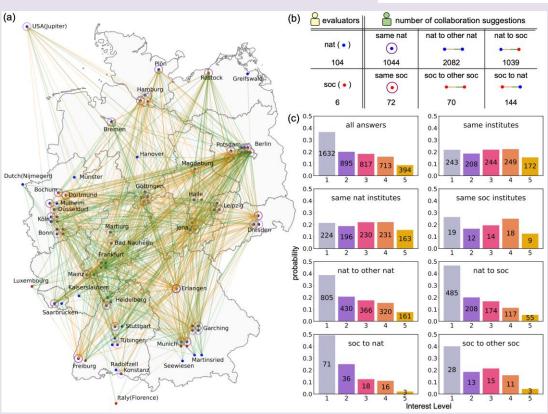
Gu, Krenn, Interesting Scientific Idea Generation Using Knowledge Graphs and LLMs: Evaluations with 100 Research Group Leaders, arXiv:2405.17044.

Krenn, Pollice, Guo, ..., Aspuru-Guzik,

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From Large Collection Of Literature





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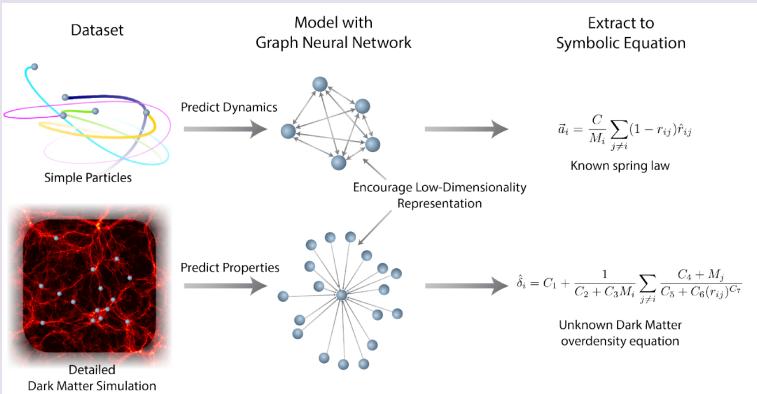
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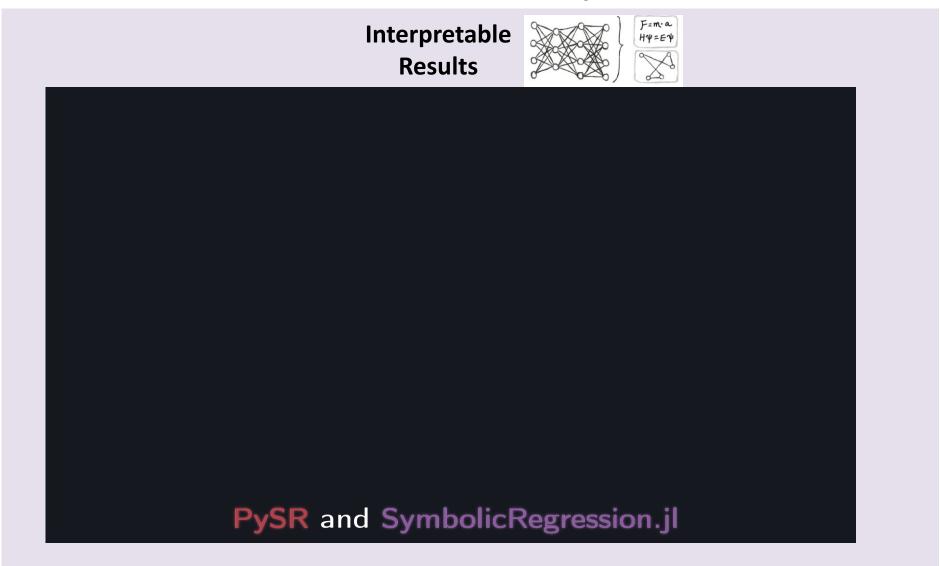
On scientific understanding with artificial intelligence







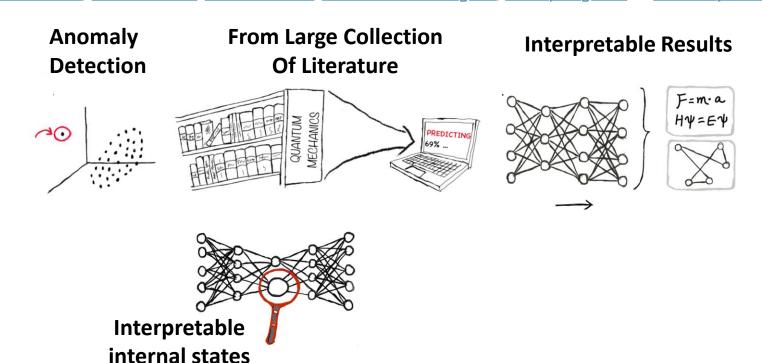
Cranmer et al., Discovering Symbolic Models from Deep Learning with Inductive Biases, NeurIPS (2020)



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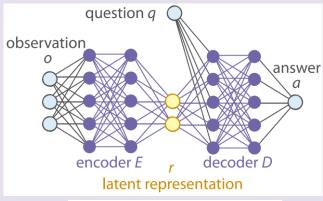
On scientific understanding with artificial intelligence

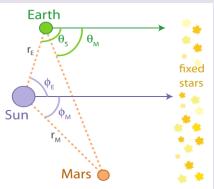


Interpretable internal states



Interpreting Latent Space



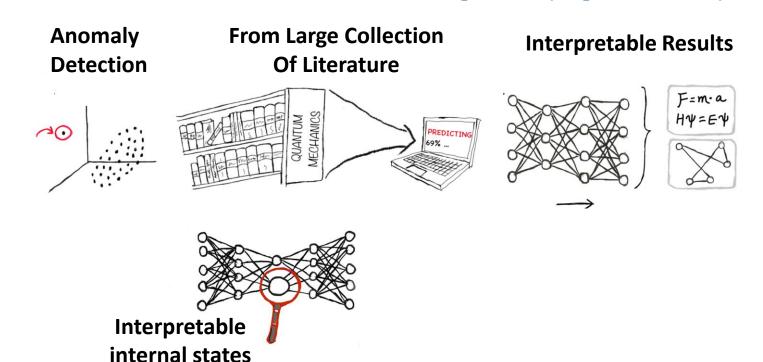


Iten et al., PRL 124, 010508 (2019)

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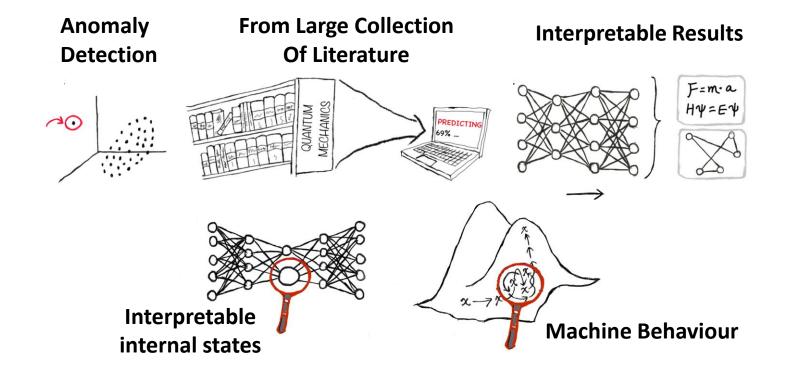
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On scientific understanding with artificial intelligence



AI-based Experimental Design:

In many domains in physics (quantum optics, gravitational wave physics, microscopes/telescopes soon), we have now algorithms for

finding solutions to open questions.

The solutions are presented such that we can learn and understand new concepts.

AI-based Experimental Design:

In many domains in physics (quantum optics, gravitational wave physics, microscopes/telescopes soon), we have now algorithms for

finding solutions to open questions.

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Automated Idea Generation:

Towards personalized, new, high-impact, interesting research idea generation

AI-based Experimental Design:

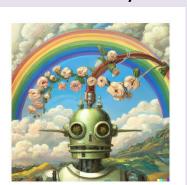
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Creativity?



Artificial Scientists

Curiosity?





(b) explore faster on Level-2

Understanding?



MK et al., On scientific understanding with artificial intelligence, Nat.Rev.Phys (2022)

AI-based Quantum Hardware & Experiment Design:

In many domains in physics (quantum optics, gravitational wave physics, microscopes/telescopes soon), we have now algorithms for

finding solutions to open questions.

The solutions are presented such that we can learn and understand new concepts.



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