

Towards an Artificial Muse for new ideas in Physics



Mario Krenn

Artificial Scientist Lab



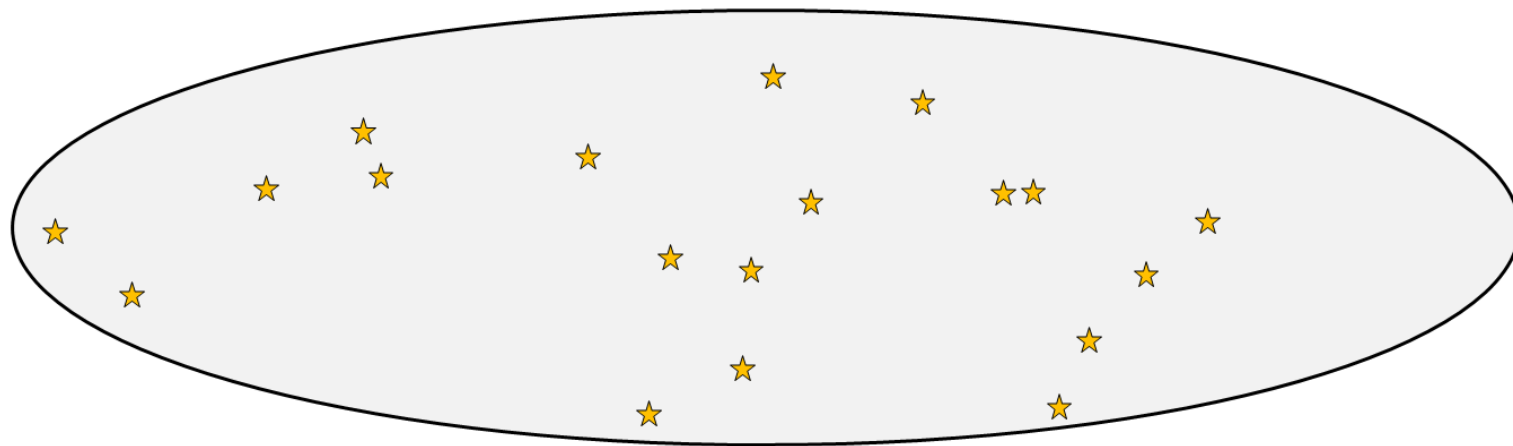
@mariokrenn6240

<http://mariokrenn.wordpress.com/>

EBERHARD KARLS
UNIVERSITÄT
TÜBINGEN



Abstract space of all experimental setups

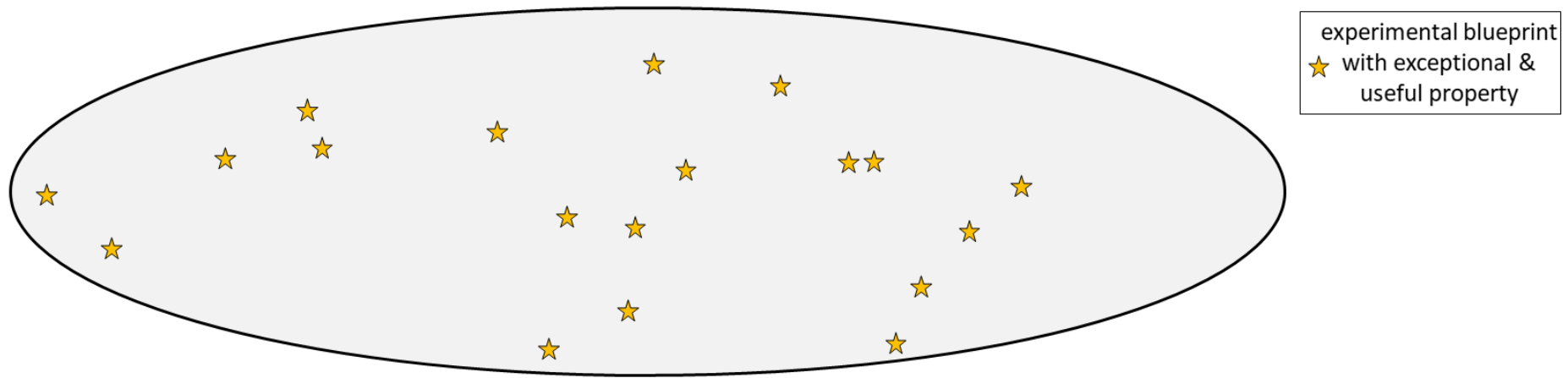


Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

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

Abstract space of all experimental setups

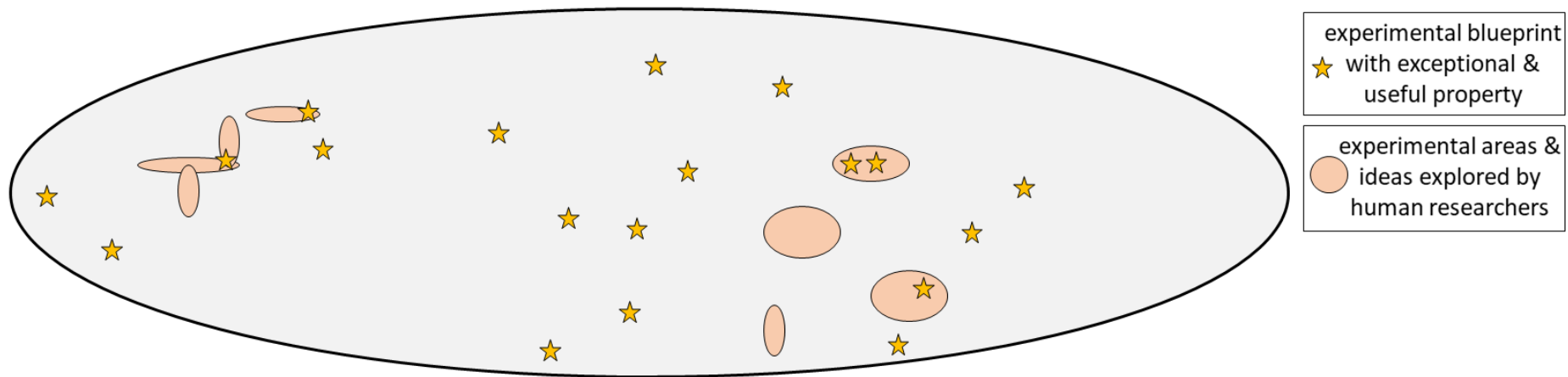


Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

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

Abstract space of all experimental setups

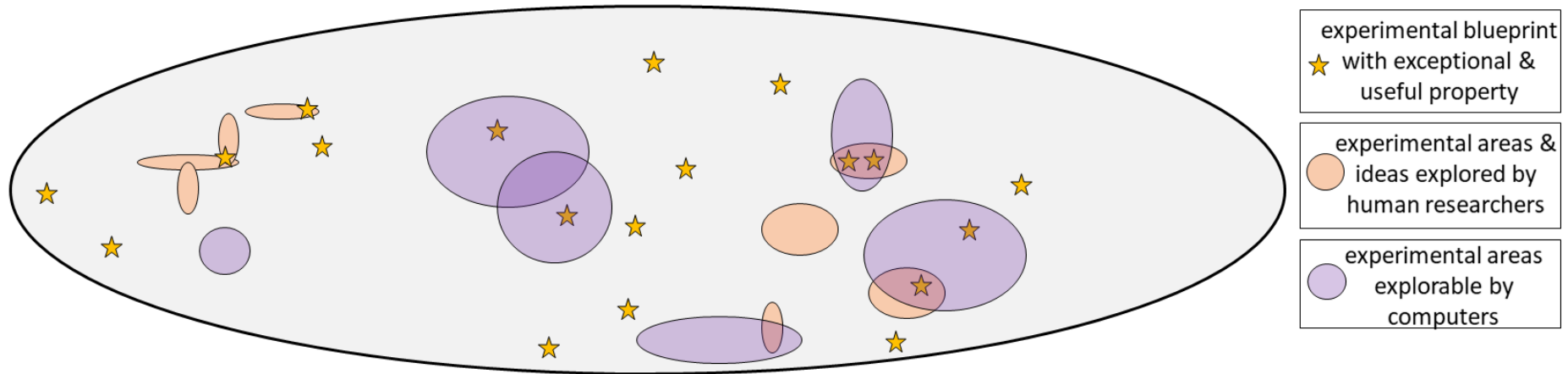


Some examples: (without symmetry)

3 lasers, 3 BS, 3 detectors: 1000 combinations

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




Abstract space of all experimental setups



How to design quantum experimental setups?

High-dimensional multipartite entanglement

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

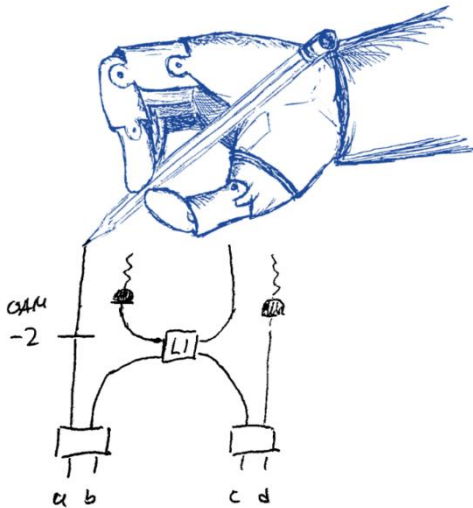
 or  or 

How to design quantum experimental setups?

High-dimensional multipartite entanglement

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

●●● or ●●● or ●●●



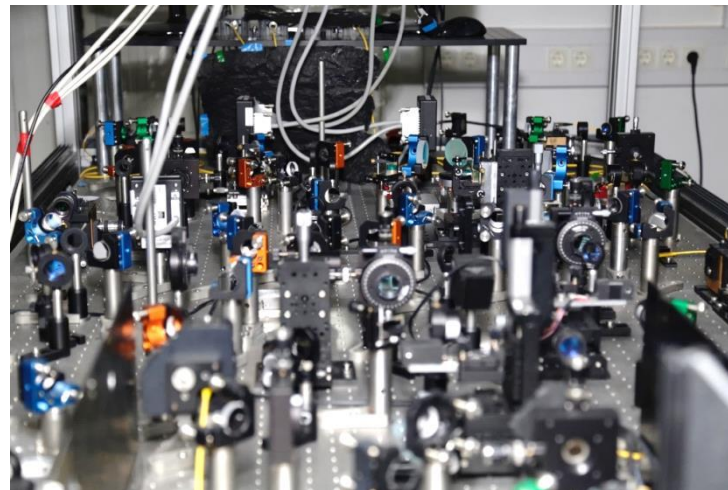
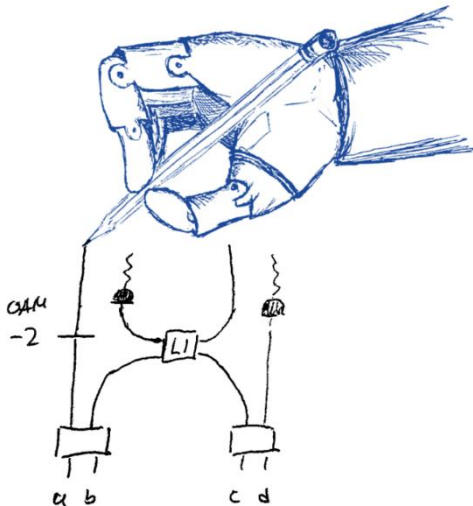
How to design quantum experimental setups?

High-dimensional multipartite entanglement

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

●●● or ●●● or ●●●

Erhard et al., *Nature Photonics* **12**, 759 (2018)



Krenn, Malik, Fickler, Lapkiewicz, Zeilinger, Automated Search for new Quantum Experiments, *Phys. Rev. Lett.* **116**, 090405 (2016)

Krenn, Erhard, Zeilinger, Computer-inspired quantum experiments, *Nat.Rev.Phys* **2**, 649 (2020).

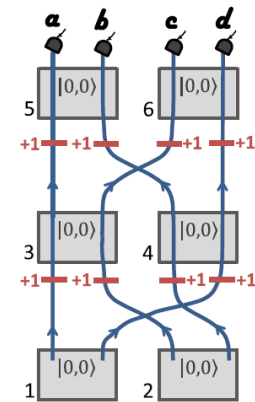
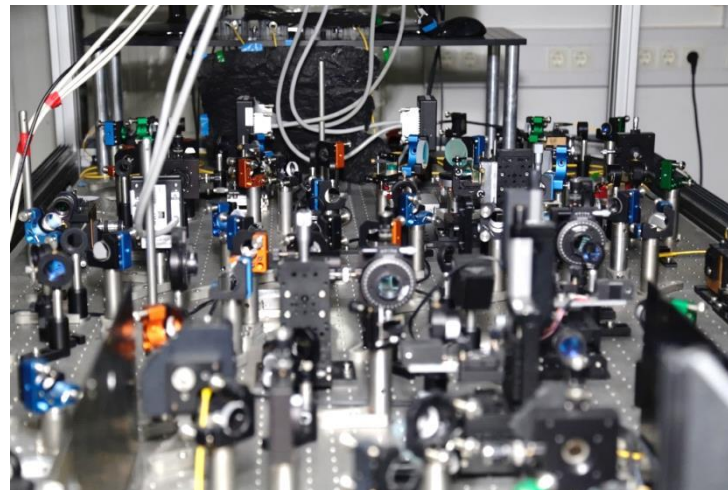
How to design quantum experimental setups?

High-dimensional multipartite entanglement

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

●●● or ●●● or ●●●

Erhard et al., *Nature Photonics* **12**, 759 (2018)



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

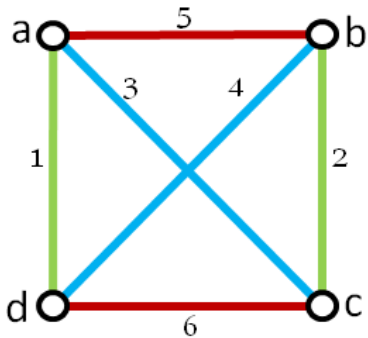
Krenn, Malik, Fickler, Lapkiewicz, Zeilinger, Automated Search for new Quantum Experiments, *Phys. Rev. Lett.* **116**, 090405 (2016)

Krenn, Erhard, Zeilinger, Computer-inspired quantum experiments, *Nat.Rev.Phys* **2**, 649 (2020).

Computer-inspired ideas and concepts

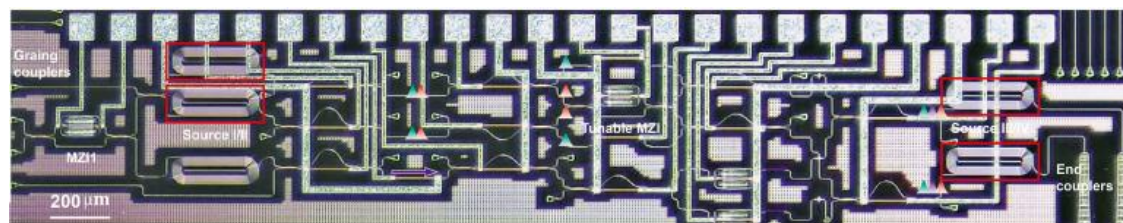
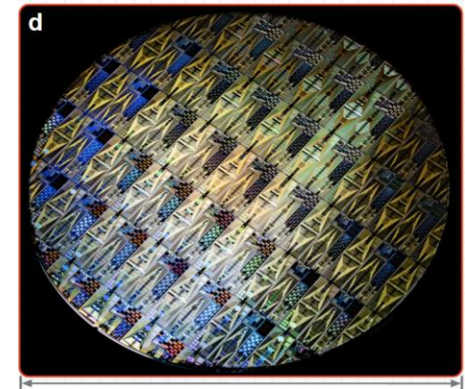
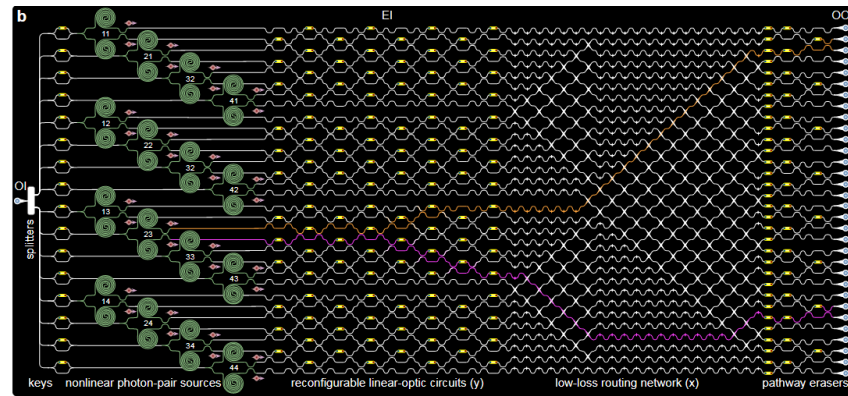
MK, Hochrainer, Lahiri, Zeilinger, Entanglement by Path Identity, *PRL* **118** (2017).

MK, Erhard, Zeilinger, *Nature Reviews Physics* **2**, 649 (2020).

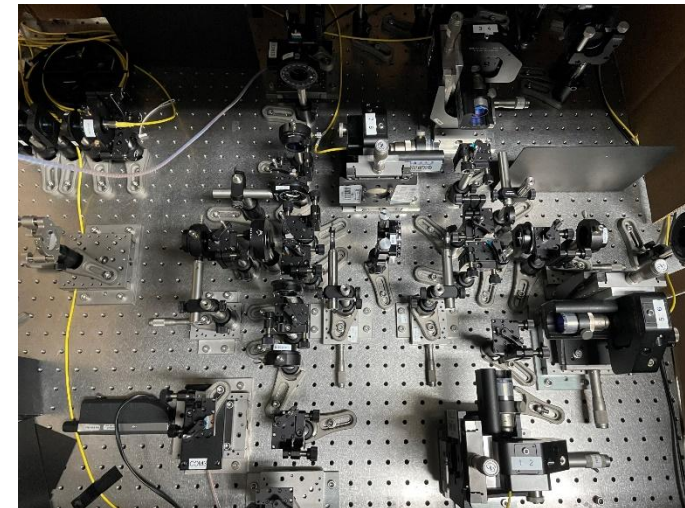


Gu, Erhard, Zeilinger, MK, *PNAS* **116** (2019).

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).

OPEN ACCESS

IOP Publishing

Physica Scripta

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

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

Perspective



CrossMark

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

Gerianne Alexander¹, Roland E Allen², Anthony Atala³, Warwick P Bowen^{4,5},
 Alan A Coley⁶ , John B Goodenough⁷, Mikhail I Katsnelson⁸, Eugene V Koonin⁹,
 Mario Krenn^{10,11}, Lars S Madsen⁵, Martin Månsson¹², Nicolas P Mauranyapin⁴,
 Art I Melvin^{10,13}, Ernst Rasel^{14,15}, Linda E Reichl¹⁶ , Roman Yampolskiy¹⁷ ,
 Philip B Yasskin¹⁸, Anton Zeilinger^{10,13} and Suzy Lidström^{19,20}

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

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

MK, Erhard, Zeilinger, *Nature Reviews Physics* **2**, 649 (2020).

OPEN ACCESS

IOP Publishing

Physica Scripta

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

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

Perspective



CrossMark

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

Chemistry Nobel 2019

Gerianne Alexander¹, Roland E Allen², Anthony Atala³, Warwick P Bowen^{4,5},
 Alan A Coley⁶, John B Goodenough⁷, Mikhail I Katsnelson⁸, Eugene V Koonin⁹,
 Mario Krenn^{10,11}, Lars S Madsen⁵, Martin Månsson¹², Nicolas P Mauranyapin⁴,
 Art I Melvin^{10,13}, Ernst Raseel^{14,15}, Linda E Reichl¹⁶, Roman Yampolskiy¹⁷,
 Philip B Yasskin¹⁸, Anton Zeilinger^{10,13} and Suzy Lidström^{19,20}

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

Highly efficient computer-designed quantum experiments

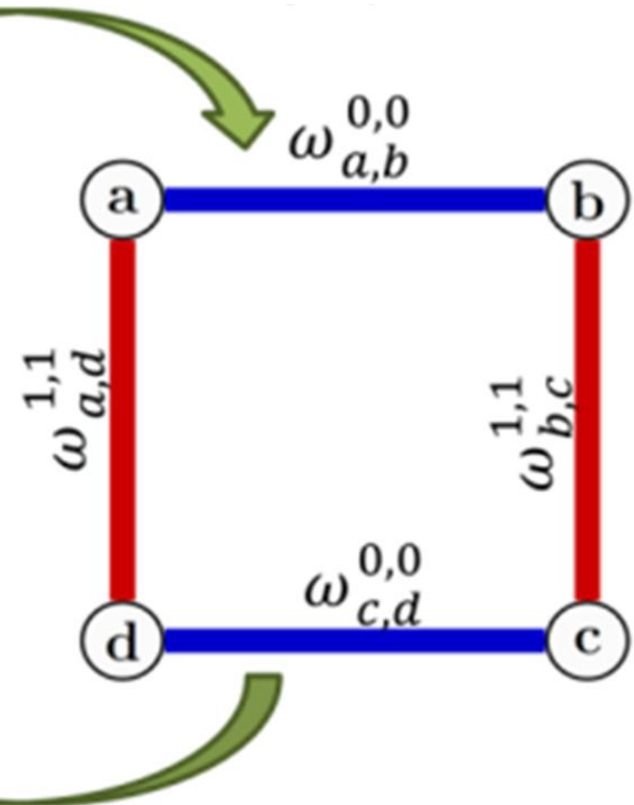
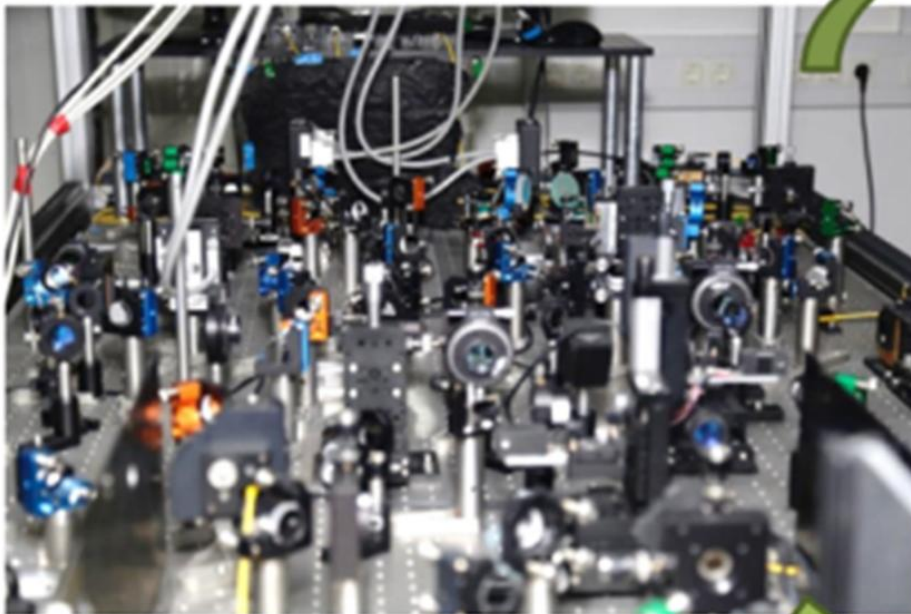
MK, Kottmann, Tischler, Aspuru-Guzik, Conceptual understanding through efficient inverse-design of quantum experiments, *Phys. Rev. X* **11**, 031044 (2021).

Highly efficient computer-designed quantum experiments

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

Change Perspective:

New representation -> orders of magnitude speed-up.



Highly efficient computer-designed quantum experiments

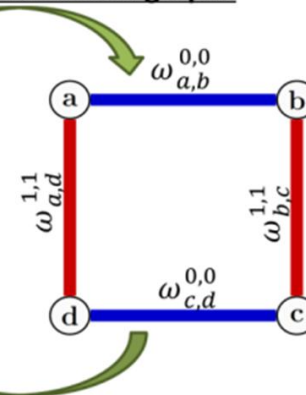
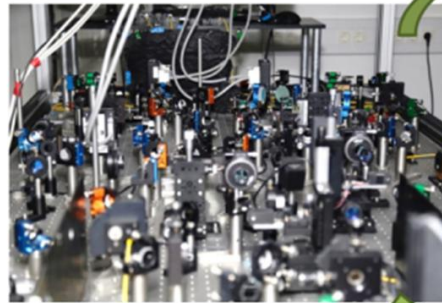
MK, Kottmann, Tischler, Aspuru-Guzik, Conceptual understanding through efficient inverse-design of quantum experiments, *Phys. Rev. X* **11**, 031044 (2021).

Change Perspective:

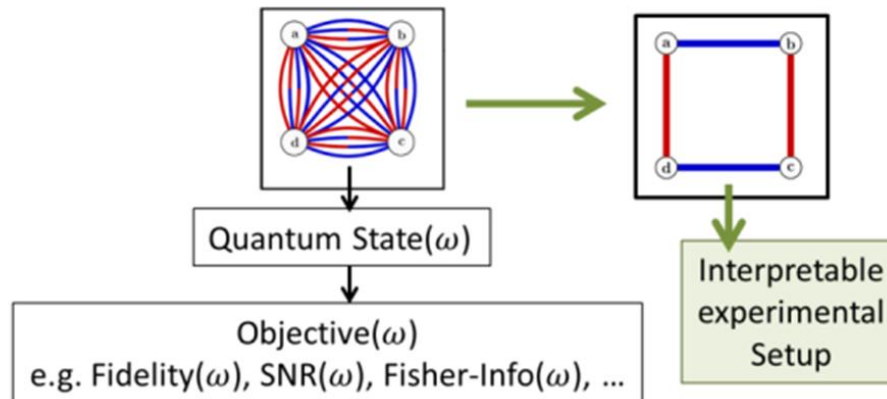
New representation -> orders of magnitude speed-up.

A) Bridge between quantum experiments and graphs

Vertex: Photonic path
Edge: Photon pair
Edge weight: amplitude
Color: Photonic Mode



B) Gradient-based optimization + discrete topological optimization



Highly efficient computer-designed quantum experiments

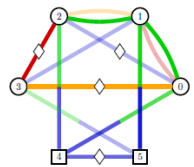


the open journal for quantum science

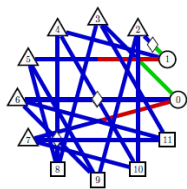
Digital Discovery of 100 diverse Quantum Experiments with PyTheus

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

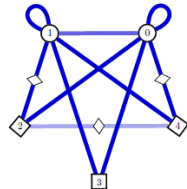
Quantum 7, 1204 (2023).



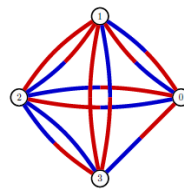
(a) Four-dimensional four-photon GHZ state (overcoming the 3-dimensional barrier for multiphoton entanglement)



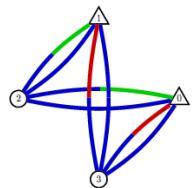
(b) Heralded 3D Bell state with single photons (improves state-of-the-art design by requiring less ancilla photons)



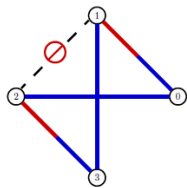
(c) Two-mode five-photon NOON state $|50\rangle + |05\rangle$ (very symmetric shape with an inscribed pentagram)



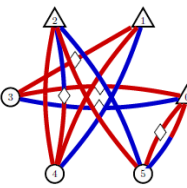
(d) A 4-qubit entangled states with unit coefficients, which requires complex-valued weights for generation



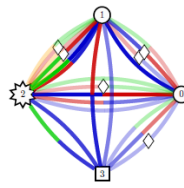
(e) Quantum measurement for a quantum communication task with quantum advantage (Mean King's Problem)



(f) Entanglement swapping without using two Bell states



(g) Toffoli quantum gate without ancilla photons



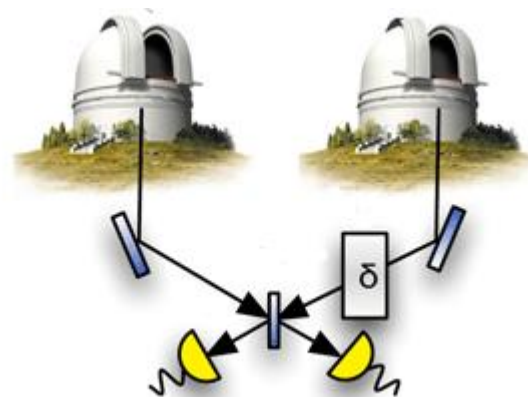
(h) Mixed state with bound entanglement that can violate a Bell inequality (counterexample to the Peres conjecture from 1999, solved 2014)

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

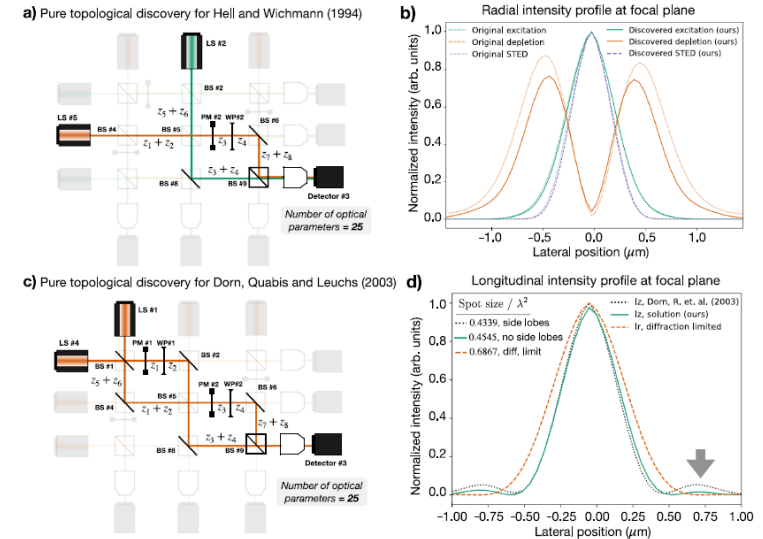
De-novo Design of Physics Experiments with AI



Gravitational wave Detections
Phys. Rev. X **15**, 021012 (2025)



Quantum-Enhanced Telescopes
arXiv 2508:nnnnn (hopefully)

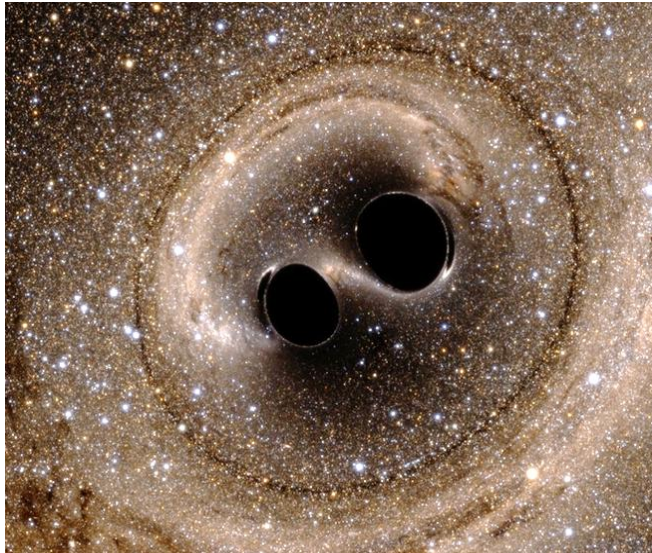


Super-Resolution Microscopy
Nature Comm. **15**, 10658 (2024)

AI-driven design of new Gravitational Wave Detectors

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

Phys. Rev. X **15**, 021012 (2025)



Phys. Rev. X **15**, 021012 (2025)

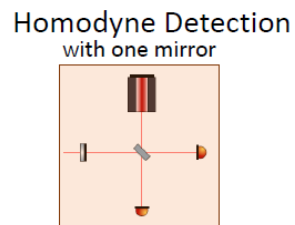
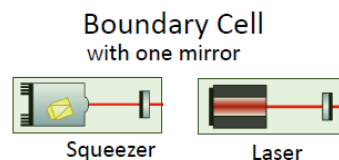
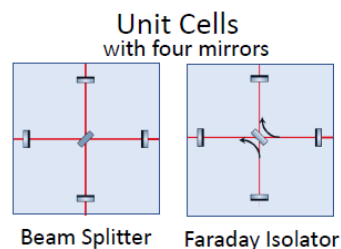
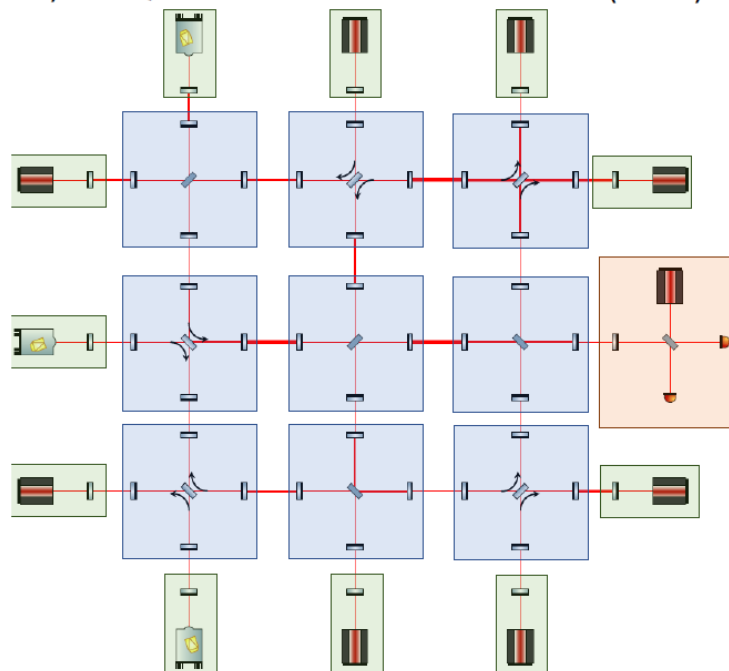
The diagram illustrates the LIGO detector layout and its noise budget. The layout shows a laser beam entering from the left, passing through a beam splitter (BS) and a polarizing beam splitter (PBS). The main arm is a 4-kilometre arm ending in an end mirror (ETMX). The signal is reflected back through the BS and PBS, and then through a series of mirrors (FI, FI, FI) to a homodyne detection system. A local oscillator (LO) is also shown. The noise budget graph plots Strain Sensitivity $[1/\sqrt{\text{Hz}}]$ against Frequency [Hz] on a log-log scale. The graph compares the noise budget for advanced LIGO (blue line) with the noise budget for a+ LIGO (orange line). The noise budget for advanced LIGO is dominated by seismic noise at low frequencies and quantum noise at high frequencies. The noise budget for a+ LIGO is dominated by seismic noise at low frequencies and quantum noise at high frequencies. The noise budget for Voyager (green line) is dominated by seismic noise at low frequencies and quantum noise at high frequencies. The noise budget for Quantum Noise Voyager (red line) is dominated by quantum noise at high frequencies. The noise budget for Seismic Noise Voyager (purple line) is dominated by seismic noise at low frequencies. The noise budget for Thermal Noise Voyager (brown line) is dominated by thermal noise at high frequencies.

AI-driven design of new Gravitational Wave Detectors

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

Phys. Rev. X **15**, 021012 (2025)

A) Quasi-Universal Interferometer (UIFO)

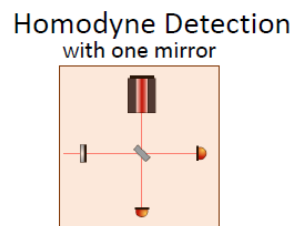
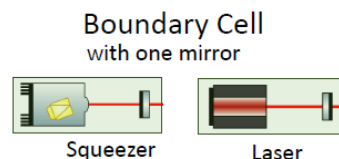
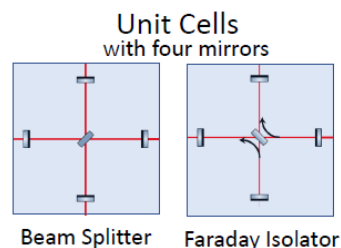
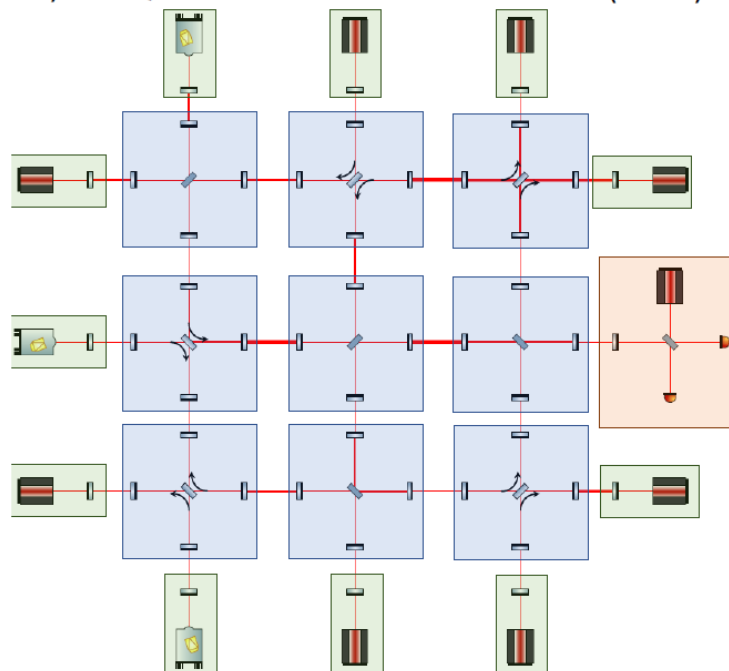


AI-driven design of new Gravitational Wave Detectors

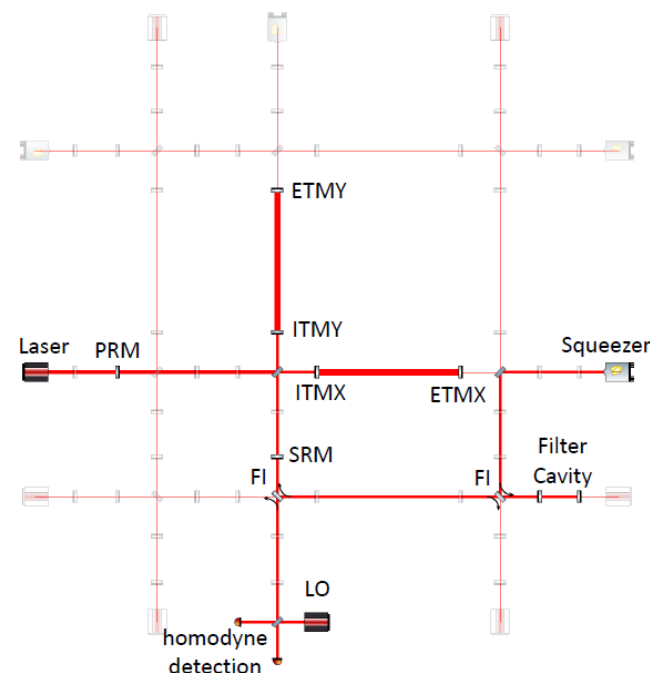
with Yehonathan Drori, Rana X. Adhikari (Caltech, LIGO)

Phys. Rev. X **15**, 021012 (2025)

A) Quasi-Universal Interferometer (UIFO)



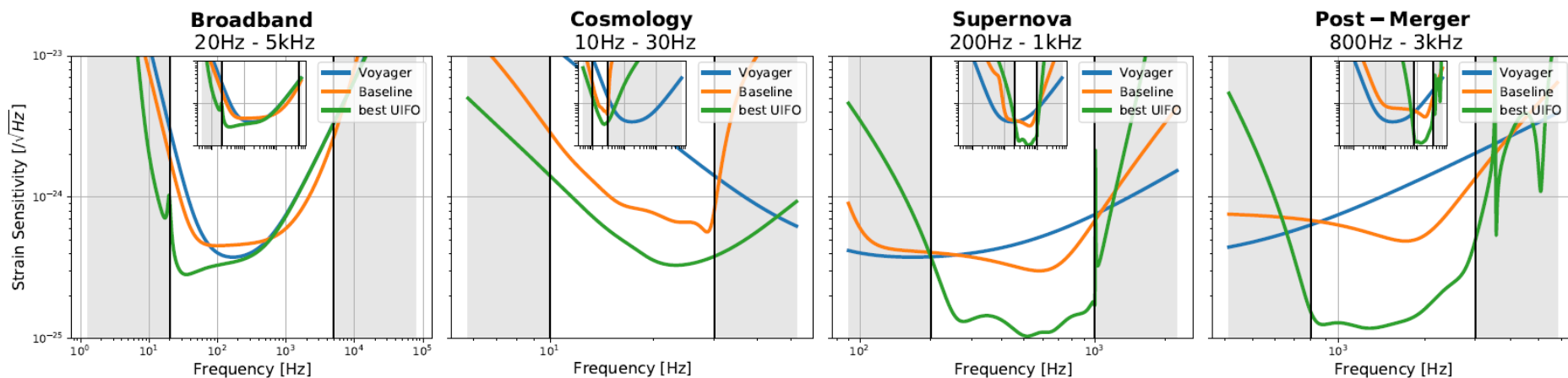
B) LIGO Voyager in UIFO



AI-driven design of new Gravitational Wave Detectors

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

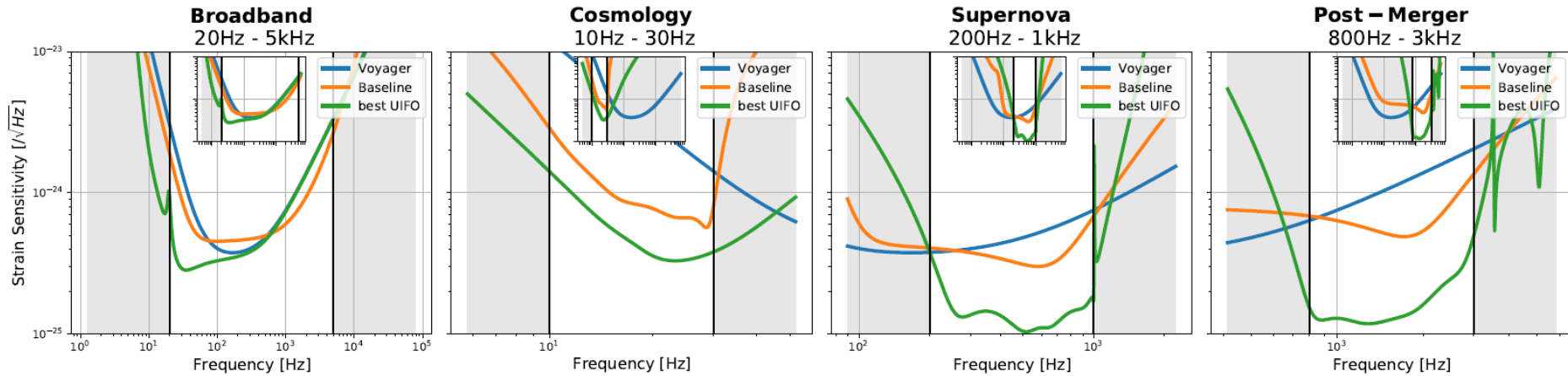
Phys. Rev. X **15**, 021012 (2025)



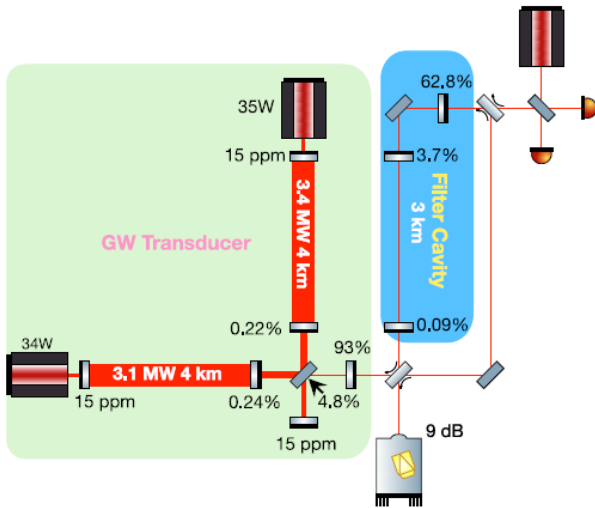
AI-driven design of new Gravitational Wave Detectors

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

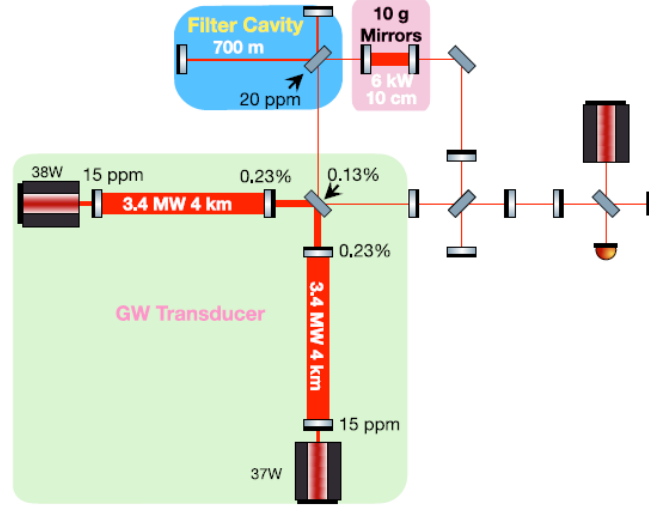
Phys. Rev. X **15**, 021012 (2025)



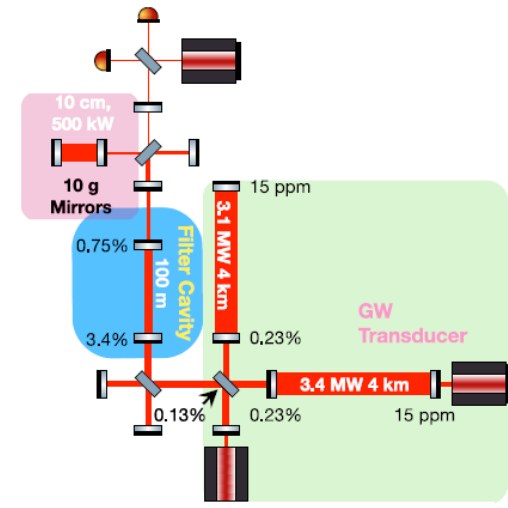
A) Broadband (30 Hz - 3 KHz)



B) Supernova (200 Hz - 1 KHz)



C) Postmerger (800 Hz - 3 KHz)

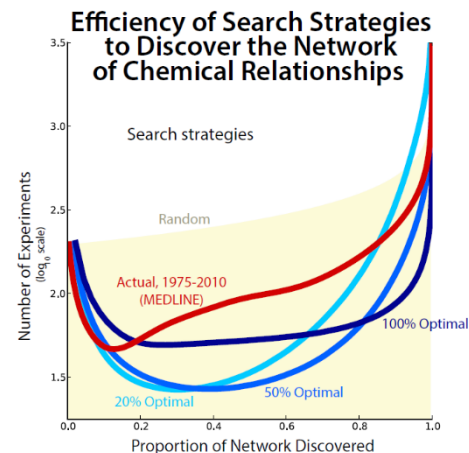
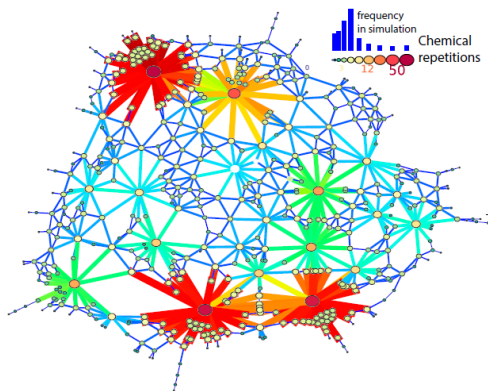


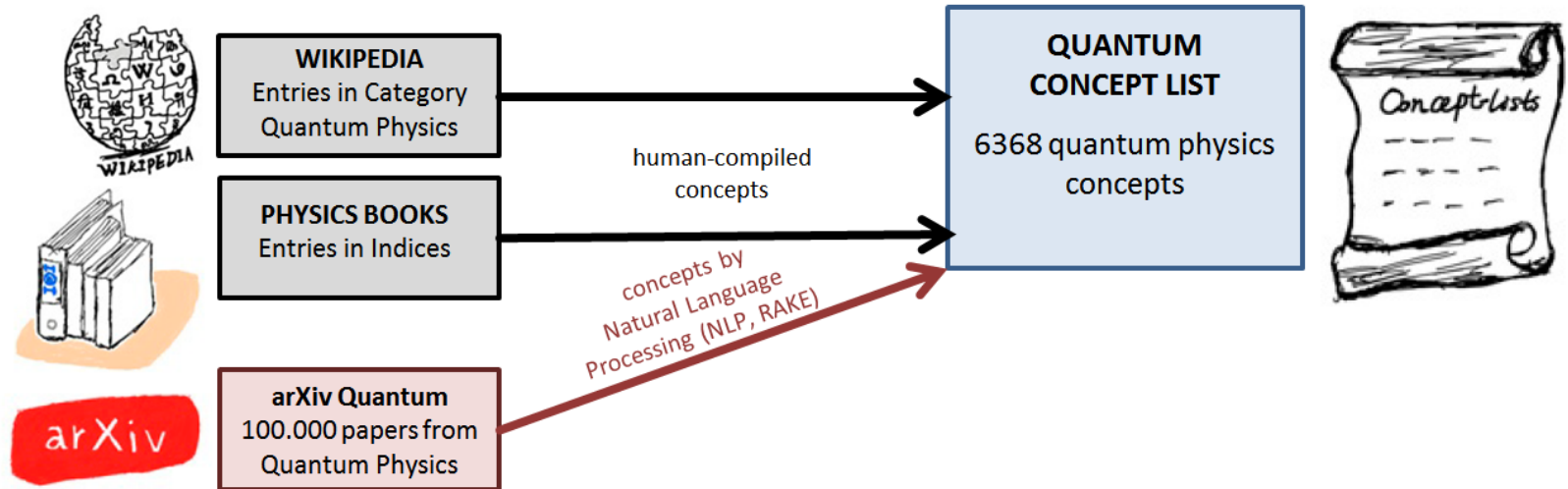
Choosing experiments to accelerate collective discovery

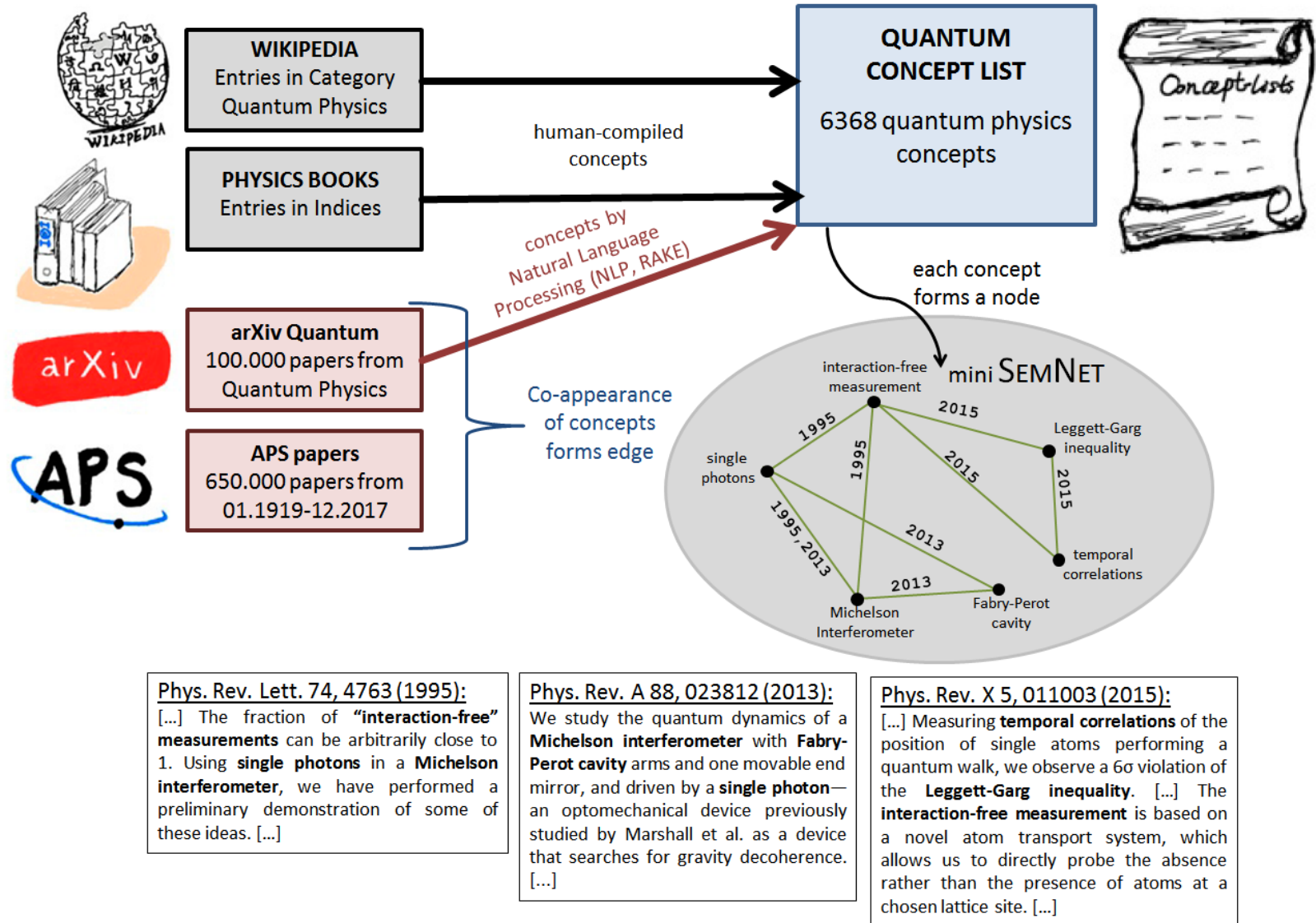
Andrey Rzhetsky^{a,b,c,1}, Jacob G. Foster^d, Ian T. Foster^{b,e}, and James A. Evans^{b,f,1}

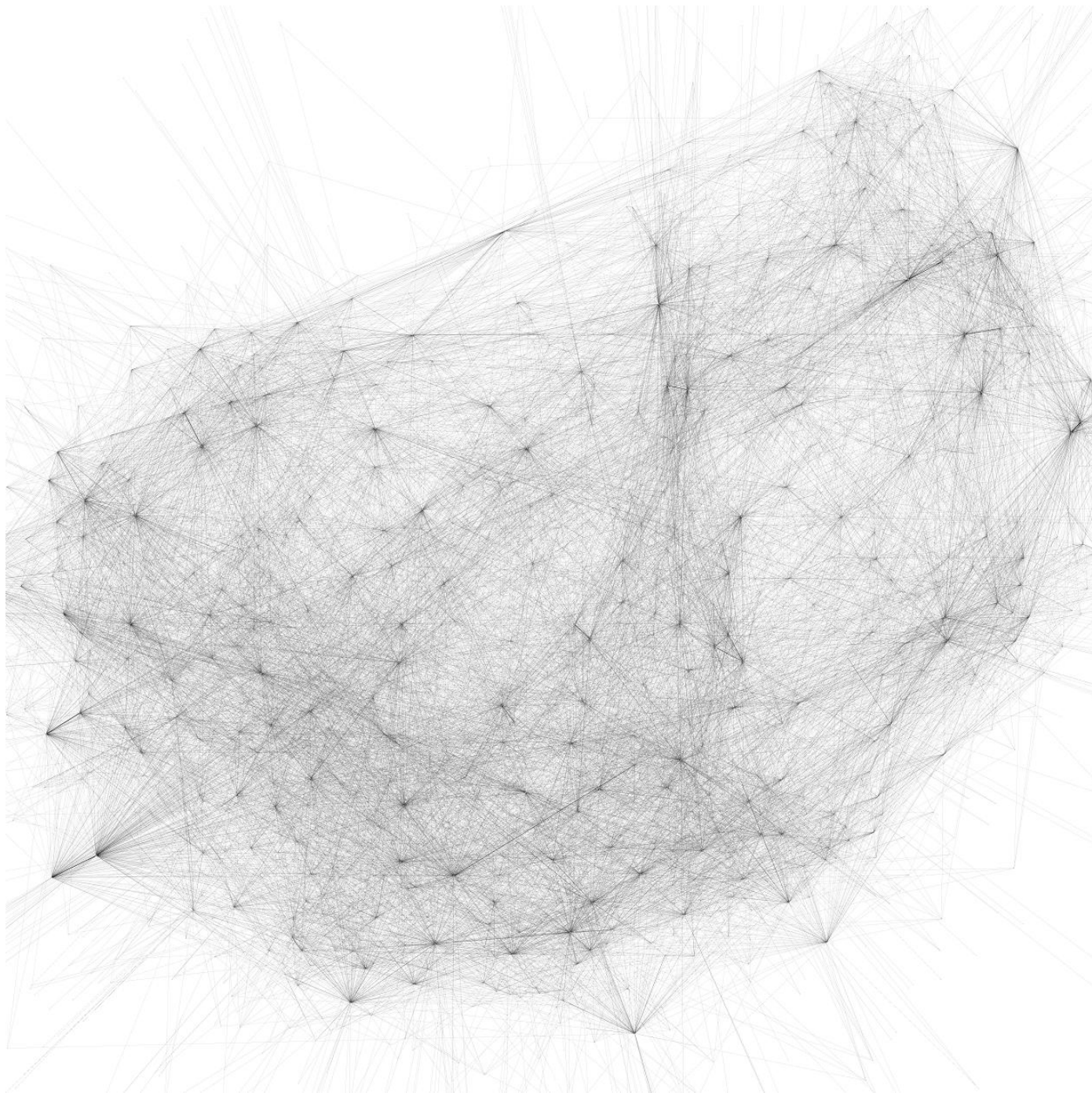
Edited by Yu Xie, University of Michigan, Ann Arbor, MI, and approved September 8, 2015 (received for review May 18, 2015)

A scientist's choice of research problem affects his or her personal career trajectory. Scientists' combined choices affect the direction and efficiency of scientific discovery as a whole. In this paper, we infer preferences that shape problem selection from patterns of published findings and then quantify their efficiency. We represent research problems as links between scientific entities in a knowledge network. We then build a generative model of discovery informed by qualitative research on scientific problem selection. We map salient features from this literature to key network properties: an entity's importance corresponds to its degree centrality, and a problem's difficulty corresponds to the network distance it spans. Drawing on millions of papers and patents published over 30 years, we use this model to infer the typical research strategy used to explore chemical relationships in biomedicine. This strategy generates conservative research choices focused on building up knowledge around important molecules. These choices become more conservative over time. The observed strategy is efficient for initial exploration of the network and supports scientific careers that require steady output, but is inefficient for science as a whole. Through supercomputer experiments on a sample of the network, we study thousands of alternatives and identify strategies much more efficient at exploring mature knowledge networks. We find that increased risk-taking and the publication of experimental failures would substantially improve the speed of discovery. We consider institutional shifts in grant making, evaluation, and publication that would help realize these efficiencies.









What will human researchers work on in the future?



MK, Zeilinger "Predicting Research Trends with Semantic and Neural Networks with an application in Quantum Physics", *PNAS* **117**(4), 1910 (2020).

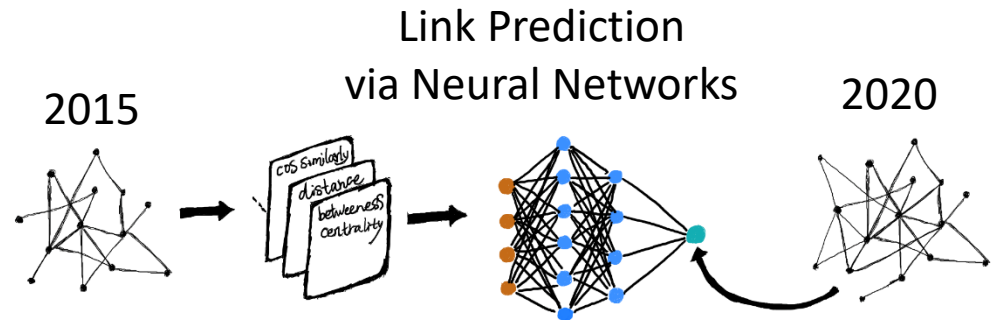
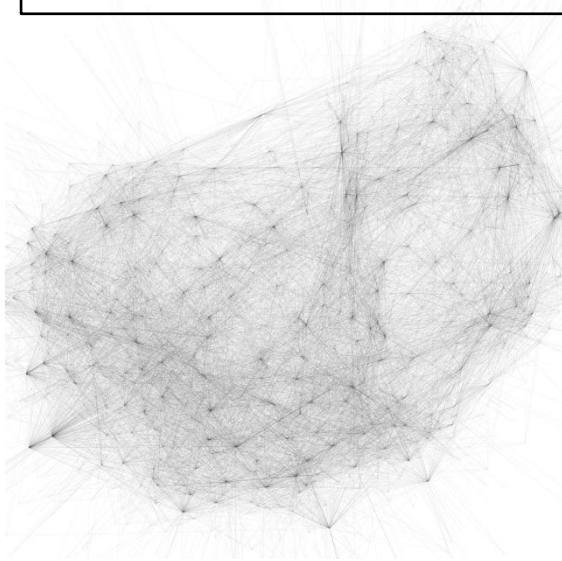
What will human researchers work on in the future?

Which unconnected pairs of concepts will be investigated together in 5 years?



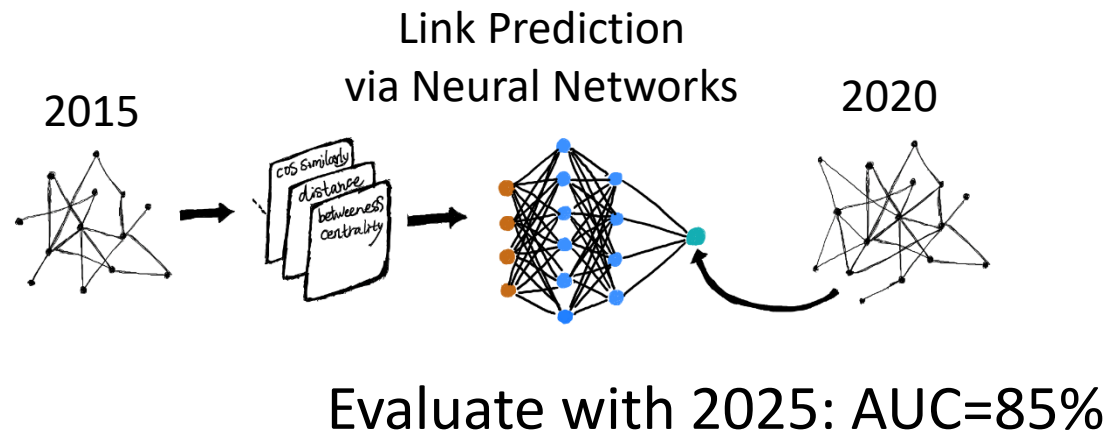
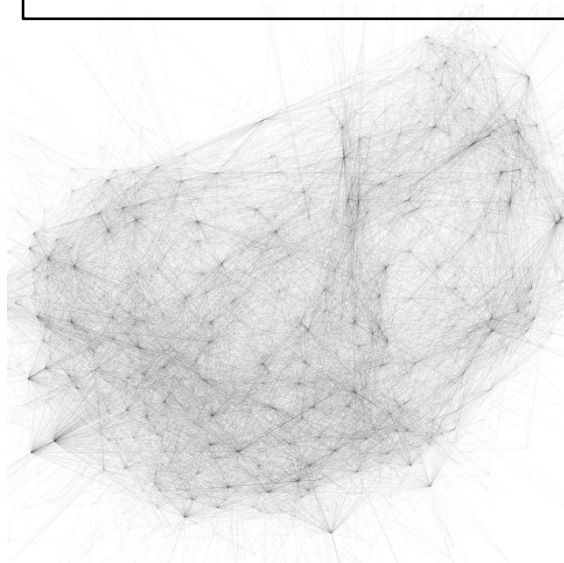
What will human researchers work on in the future?

Which unconnected pairs of concepts will be investigated together in 5 years?



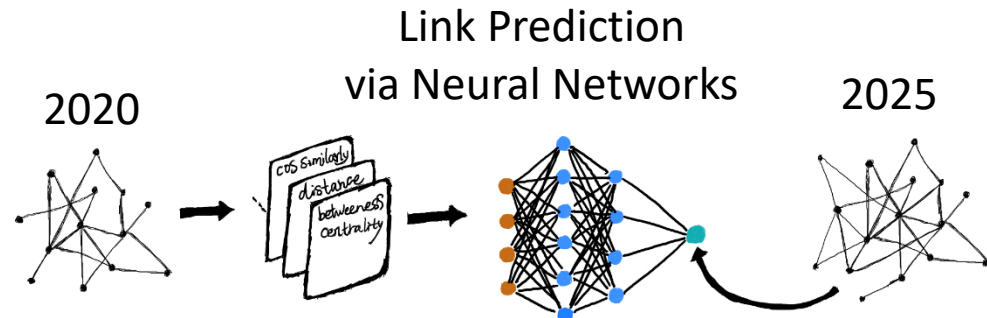
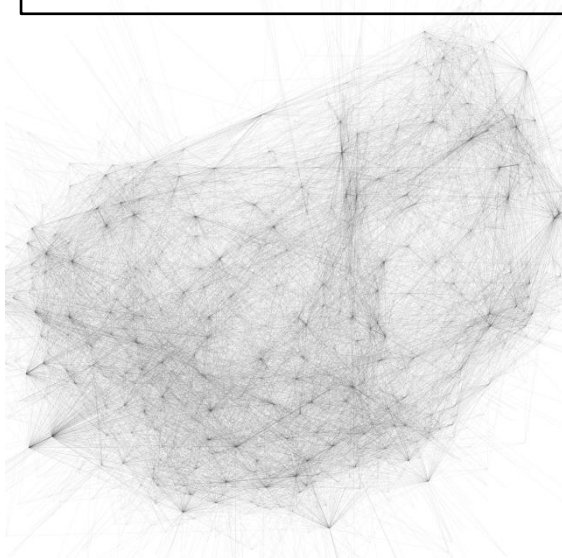
What will human researchers work on in the future?

Which unconnected pairs of concepts will be investigated together in 5 years?



What will human researchers work on in the future?

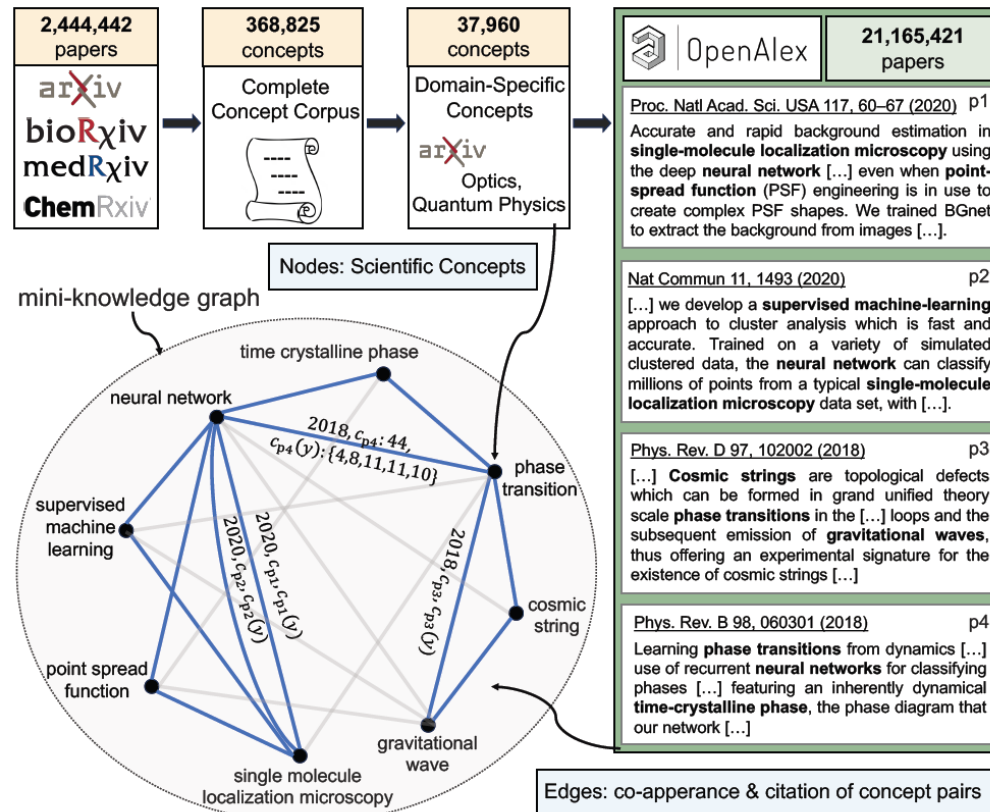
Which unconnected pairs of concepts will be investigated together in 5 years?



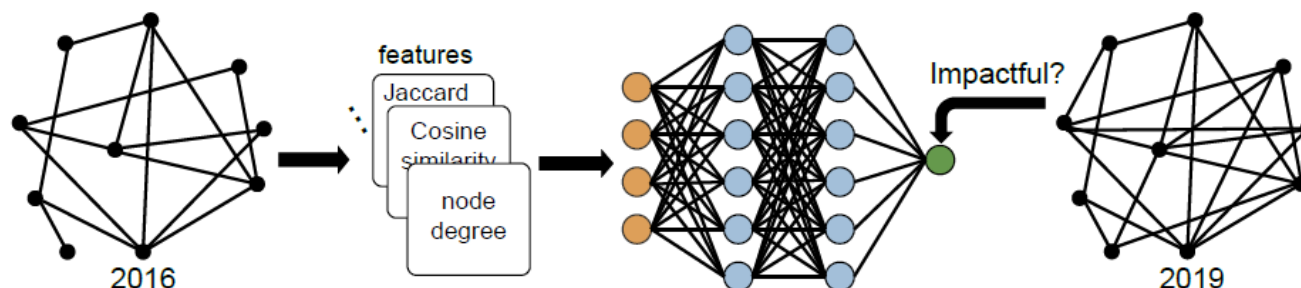
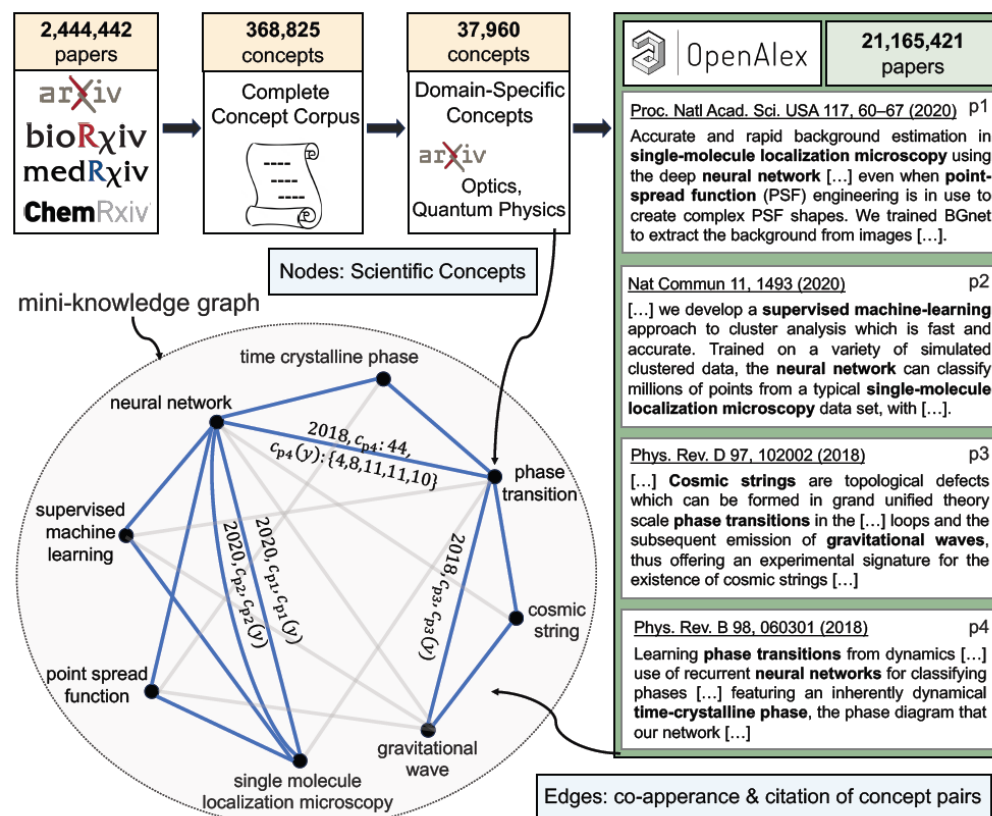
Then: From 2025 to 2030!

What will be impactful?

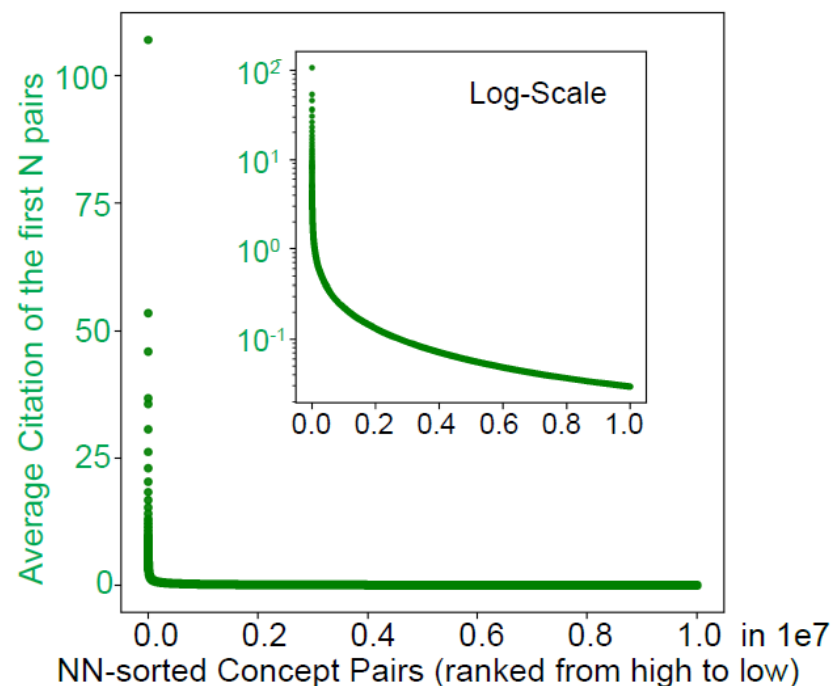
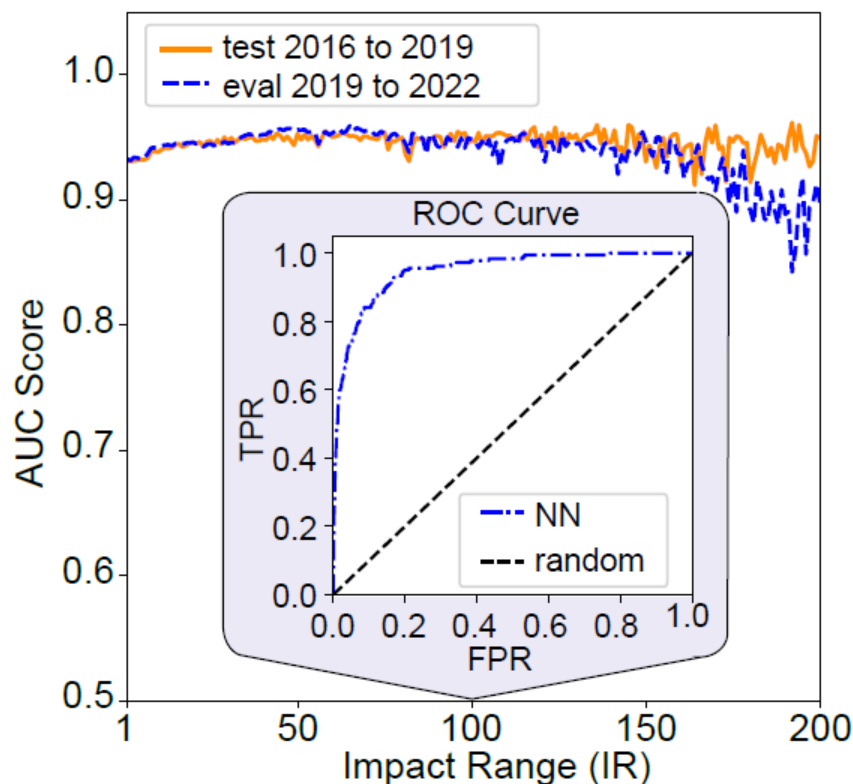
What will be impactful?



What will be impactful?

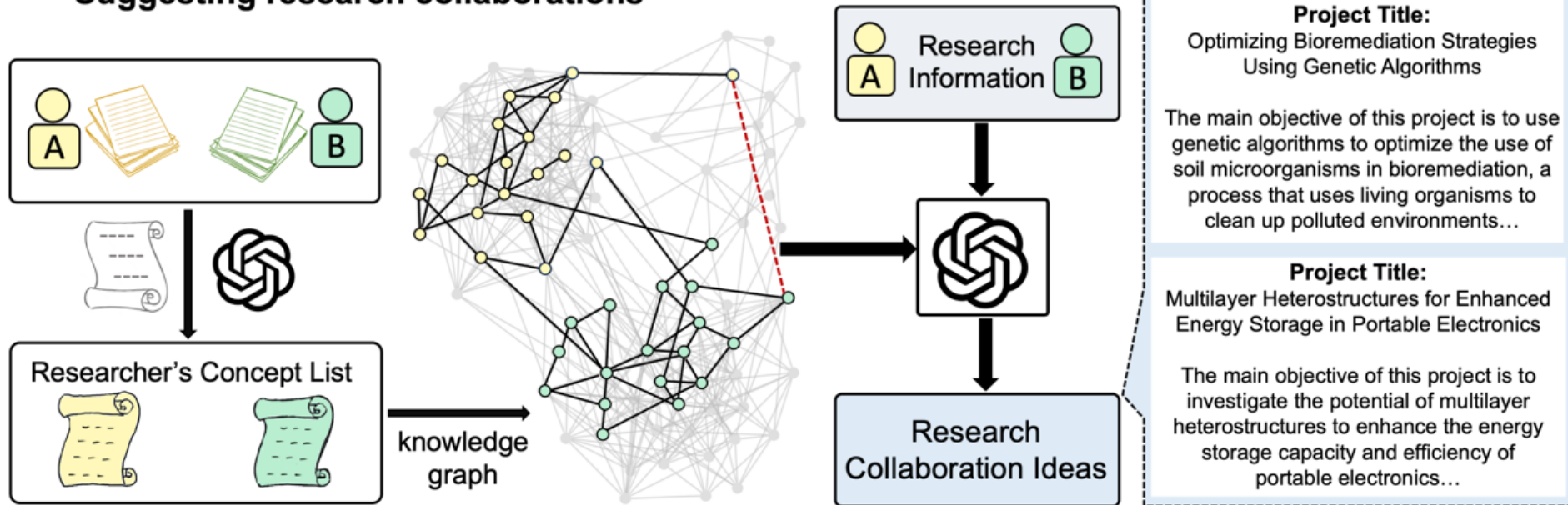


What will be impactful?

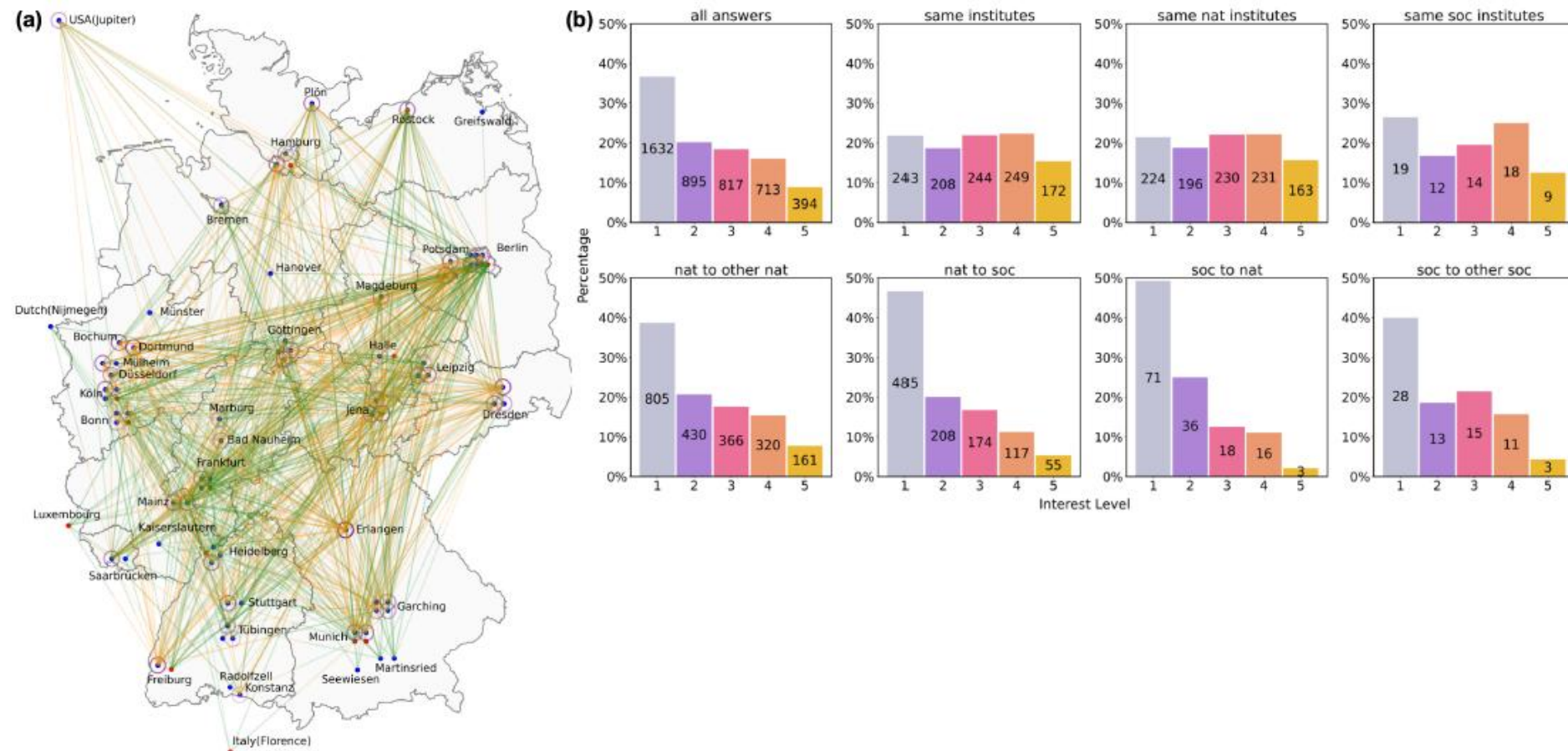


Real project ideas?

Suggesting research collaborations

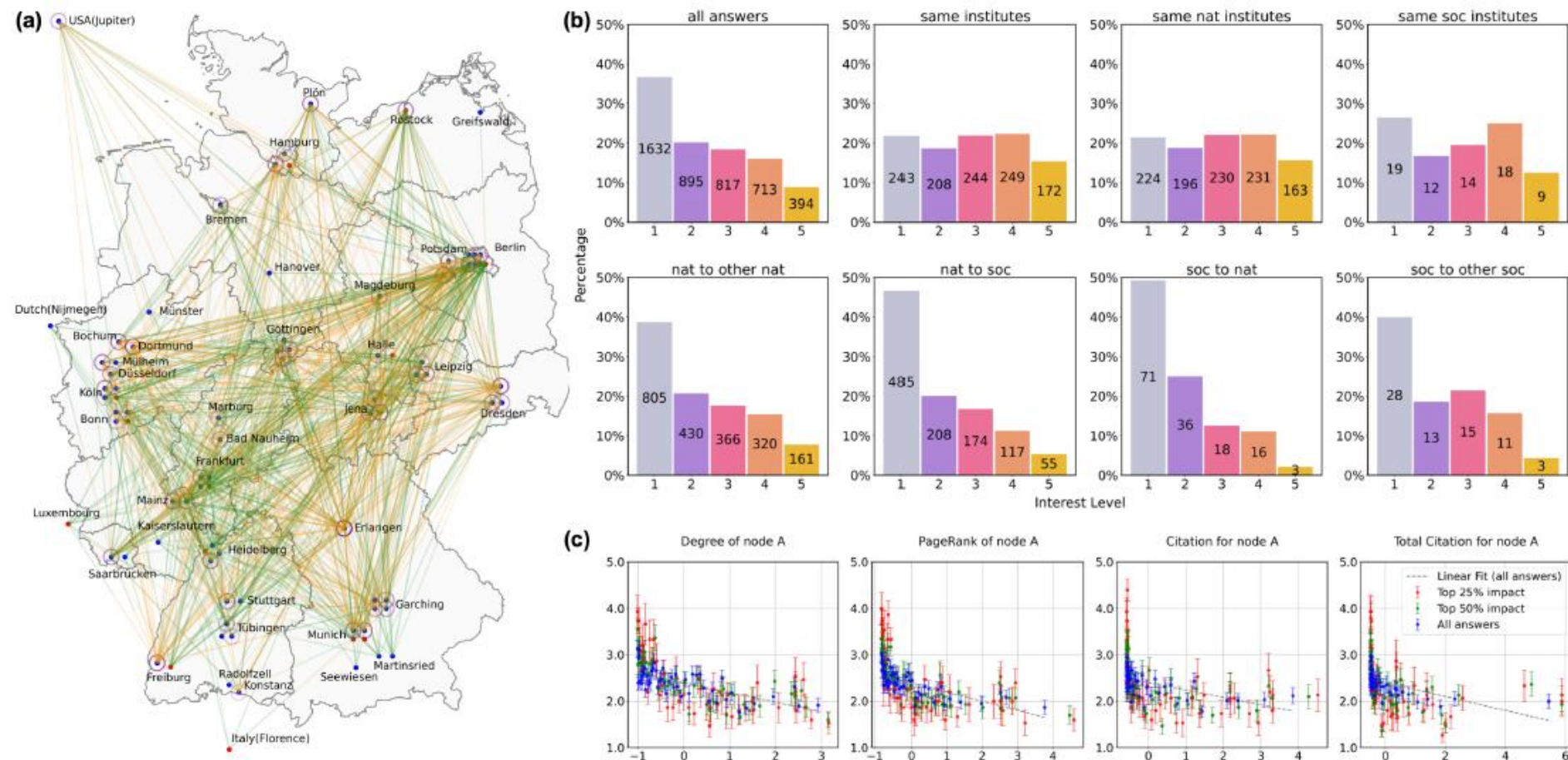


Real project ideas?



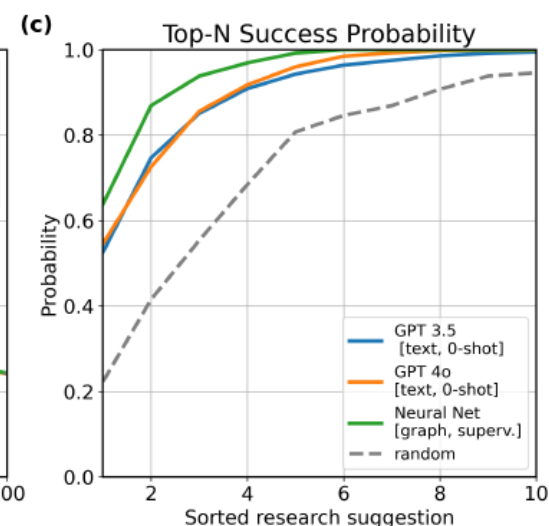
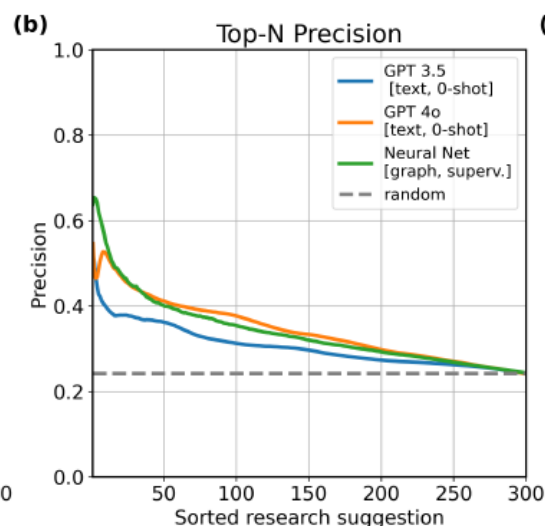
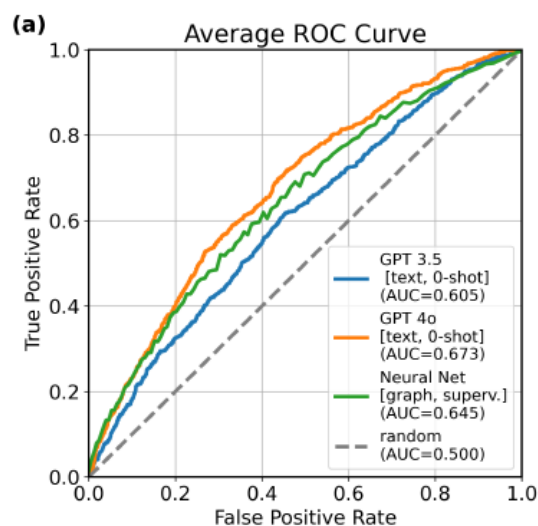
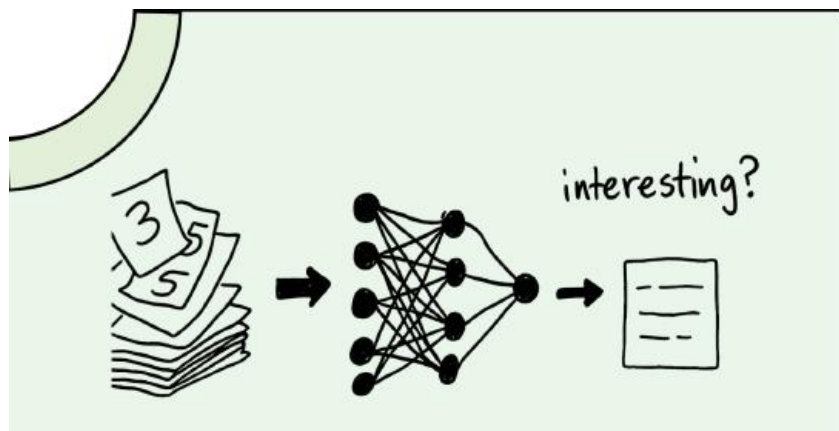
*Gu, Krenn, Interesting Scientific Idea Generation using Knowledge Graphs and LLMs:
Evaluations with 100 Research Group Leaders, arXiv:2405.17044.*

Real project ideas?



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

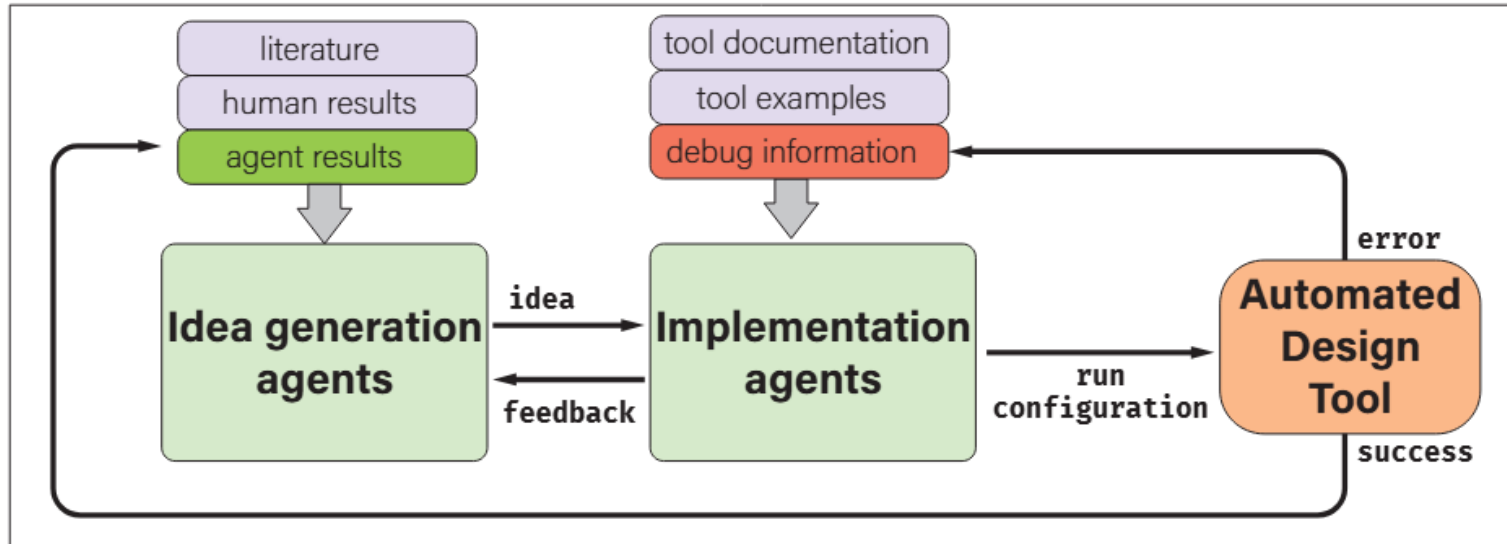
Real project ideas?



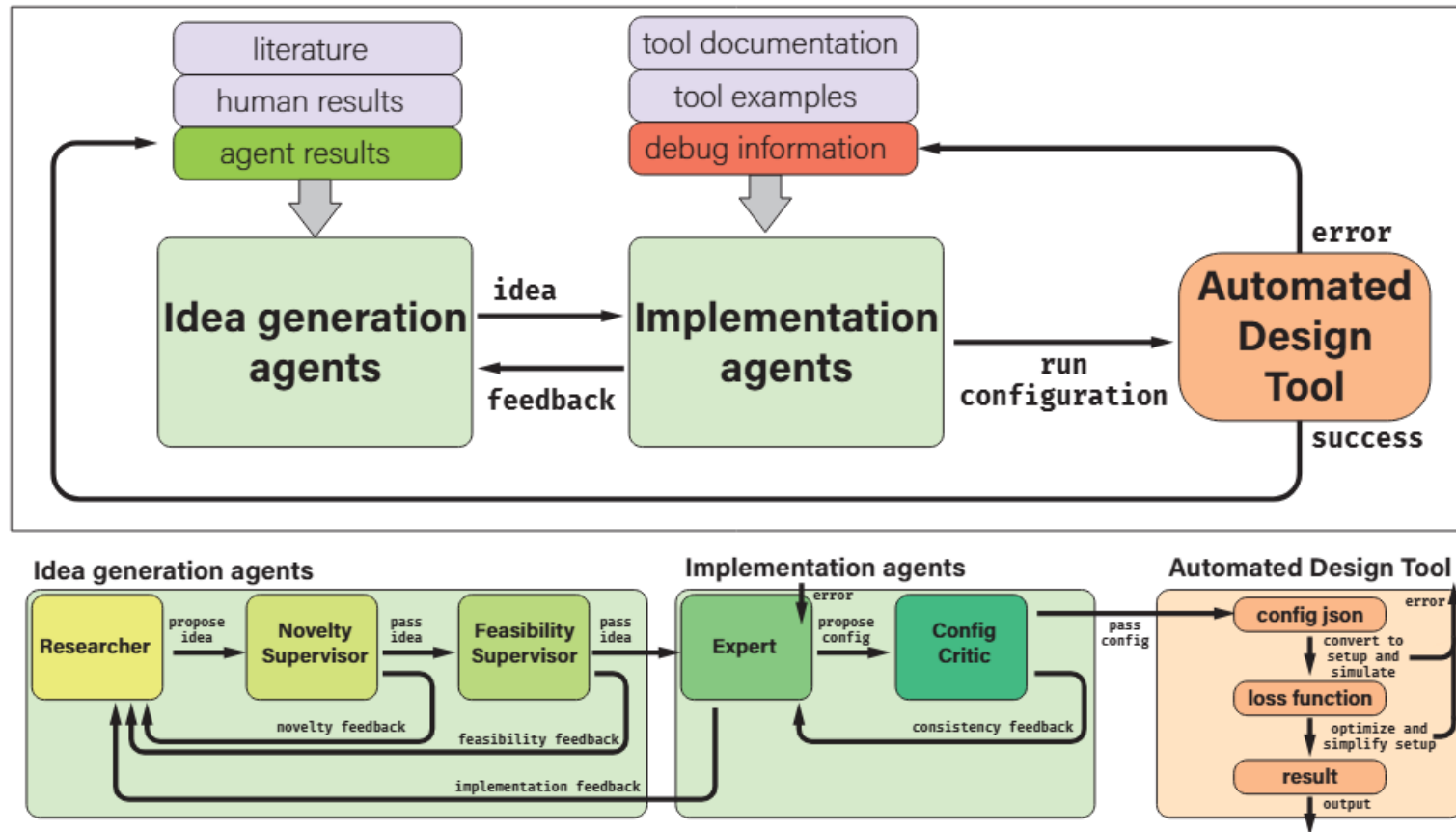
Gu, Krenn, *Interesting Scientific Idea Generation using Knowledge Graphs and LLMs: Evaluations with 100 Research Group Leaders*, arXiv:2405.17044.

Ongoing: Agentic Automated Discovery Framework in Quantum Mechanics

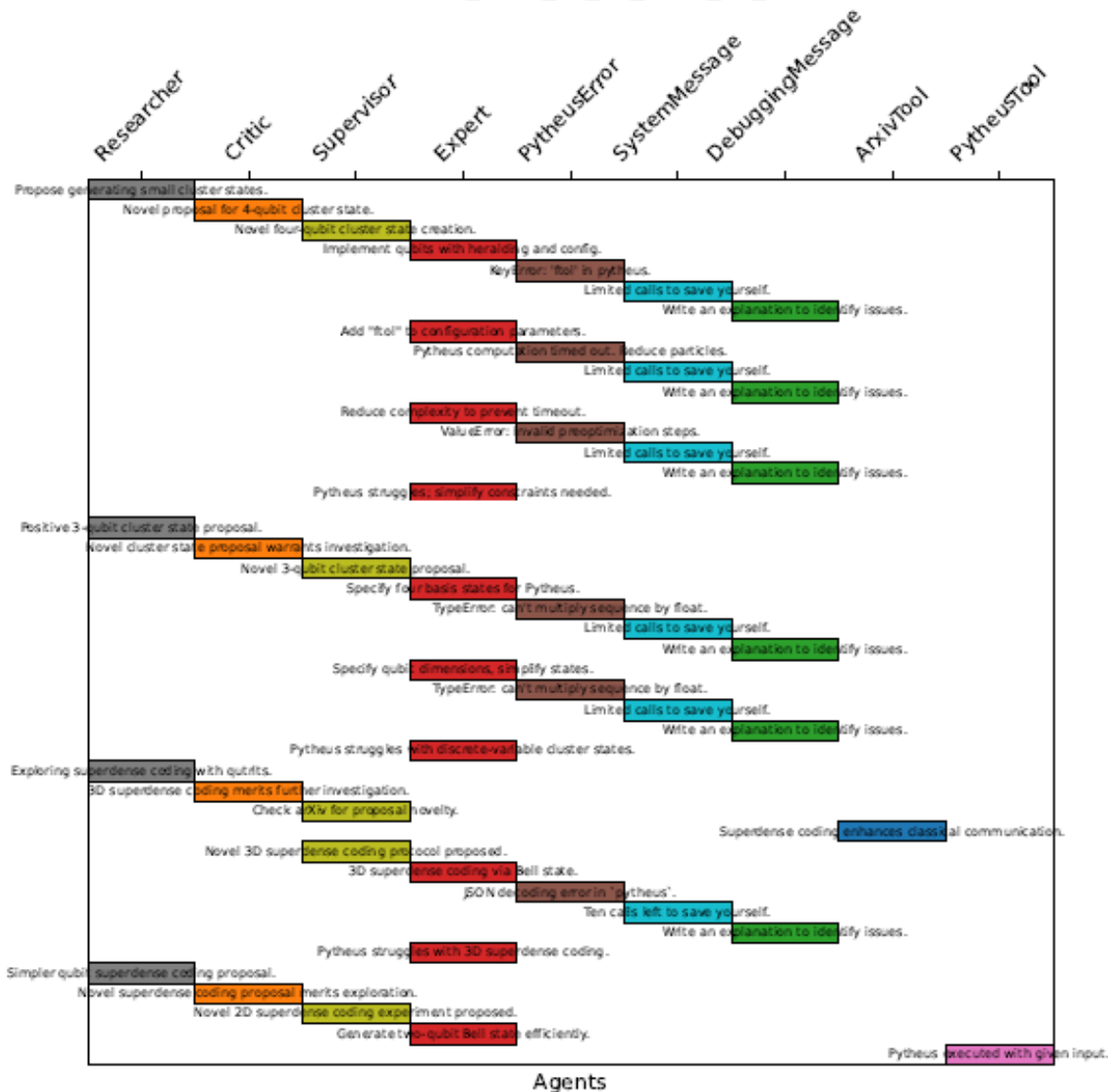
Ongoing: Agentic Automated Discovery Framework in Quantum Mechanics



Ongoing: Agentic Automated Discovery Framework in Quantum Mechanics



Ongoing: Agentic Automated Discovery Framework in Quantum Mechanics

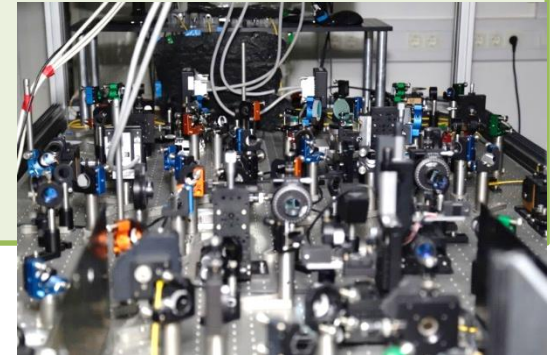


Conclusion

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.**

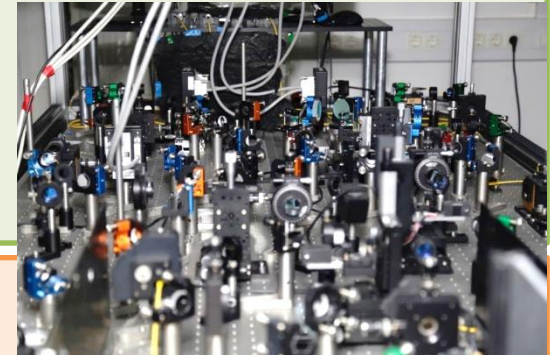


Conclusion

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.**



Automated Idea Generation:

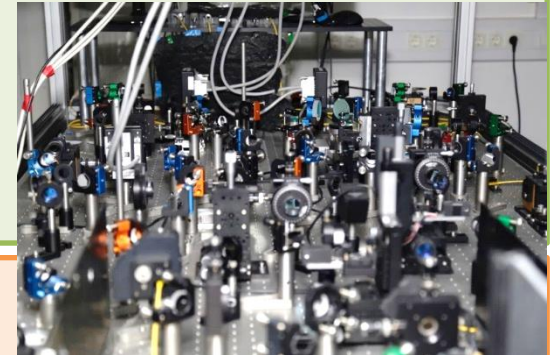
Towards personalized, new, high-impact, interesting research idea generation

Conclusion

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.**



Automated Idea Generation:

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

Artificial Scientists

Creativity?



Curiosity?

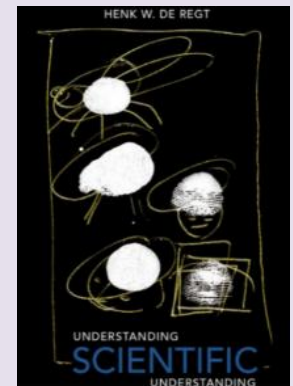


(a) learn to explore on Level-1



(b) explore faster on Level-2

Understanding?

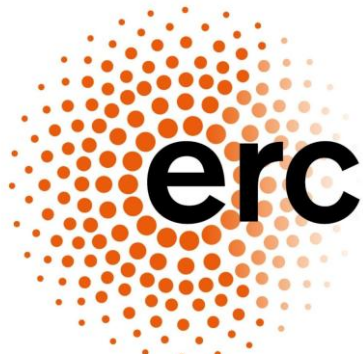
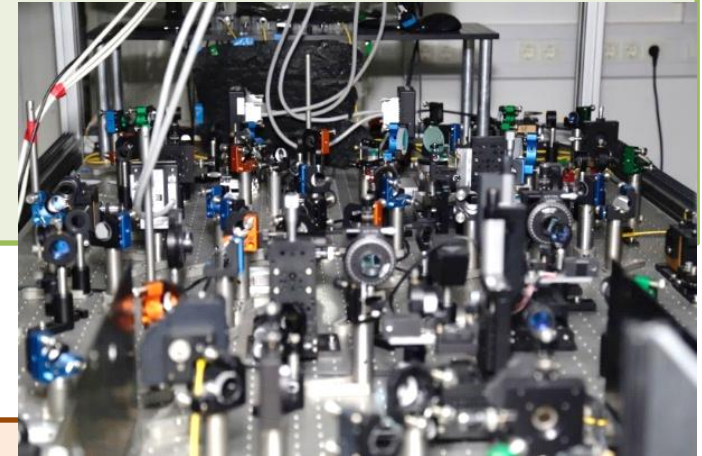


Conclusion

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.**



ERC Starting Grant 2024

EBERHARD KARLS
UNIVERSITÄT
TÜBINGEN



ArtDisQ

Artificial Scientific Discovery
of advanced Quantum Hardware
with high-performance Simulators

**Numerous PhD and
PostDoc positions available!!!**