

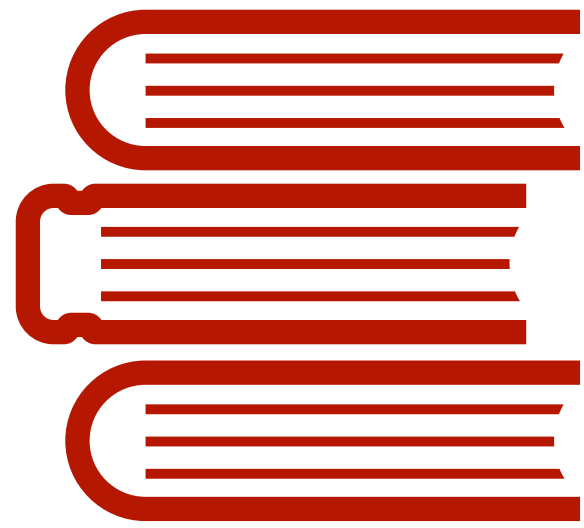
# **Spoofing Linear Cross-Entropy Benchmarking in Shallow Quantum Circuits**

Boaz Barak, **Chi-Ning Chou**, Xun Gao  
Harvard University

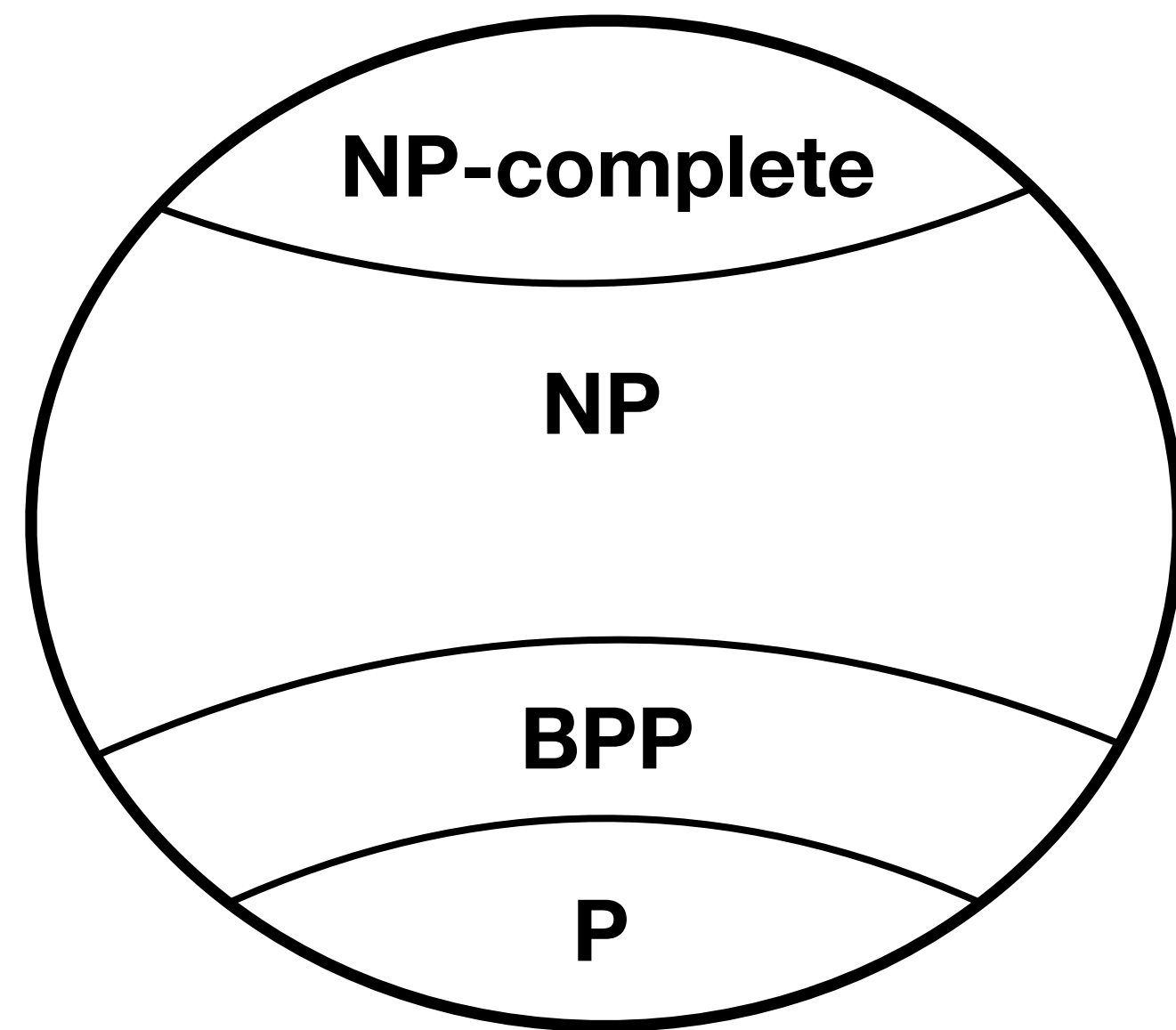
ITCS 2021

# Extended Church-Turing Thesis (ECTT)

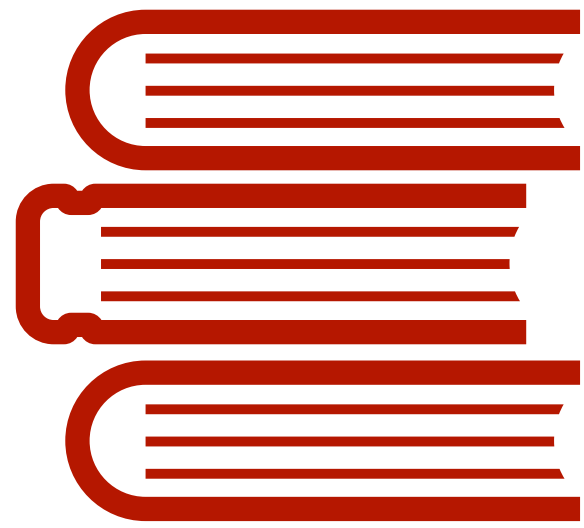
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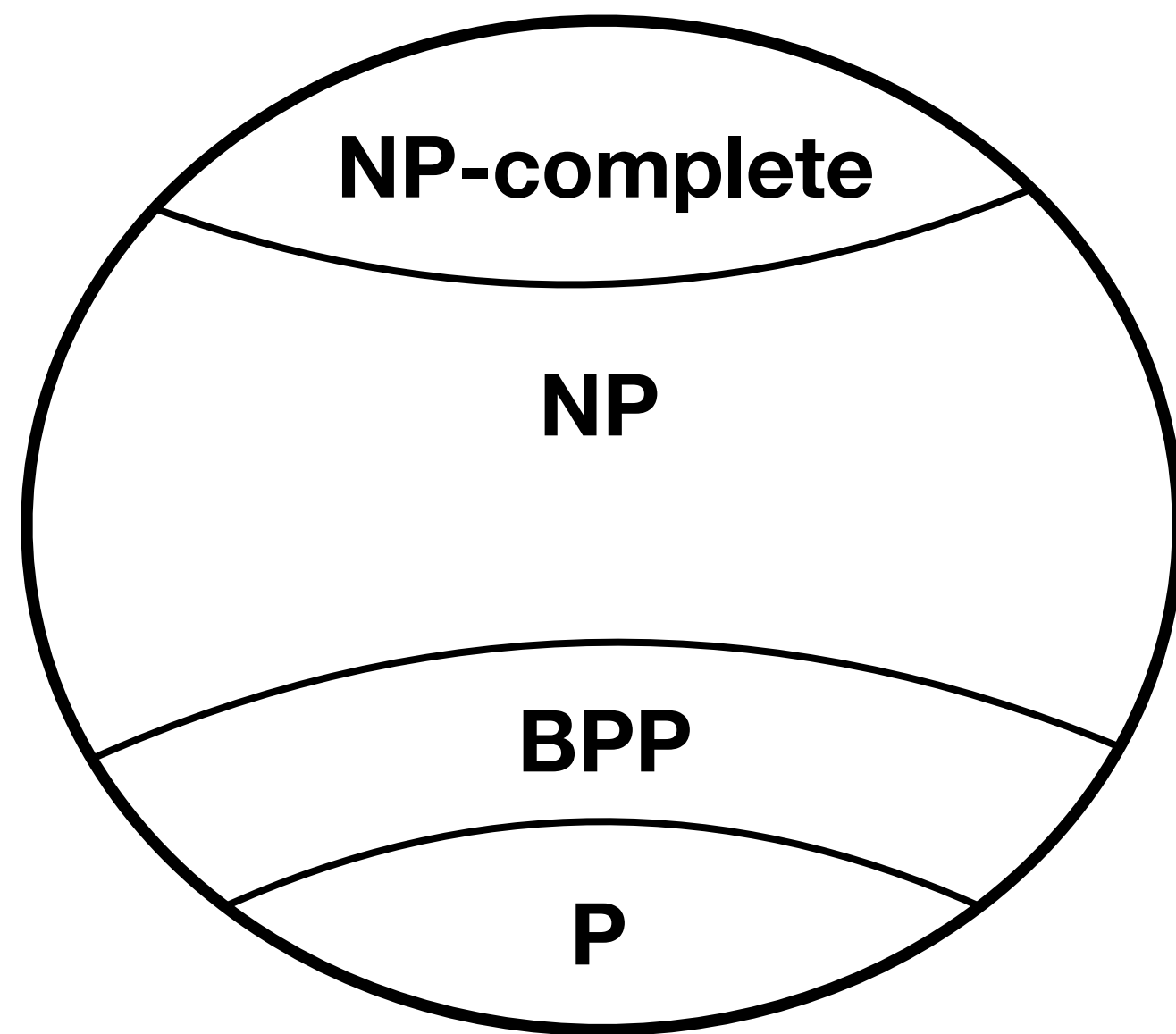
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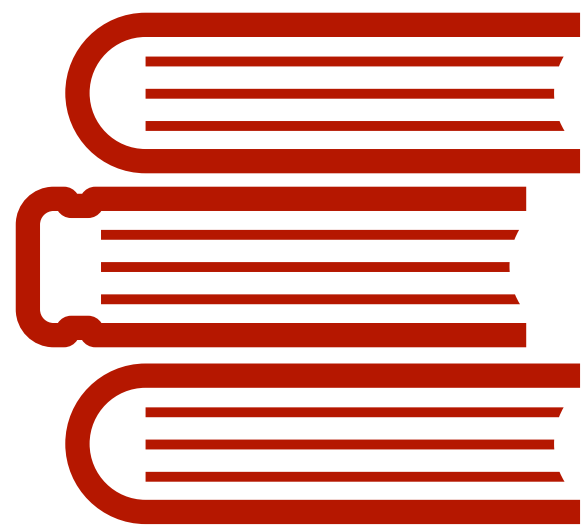


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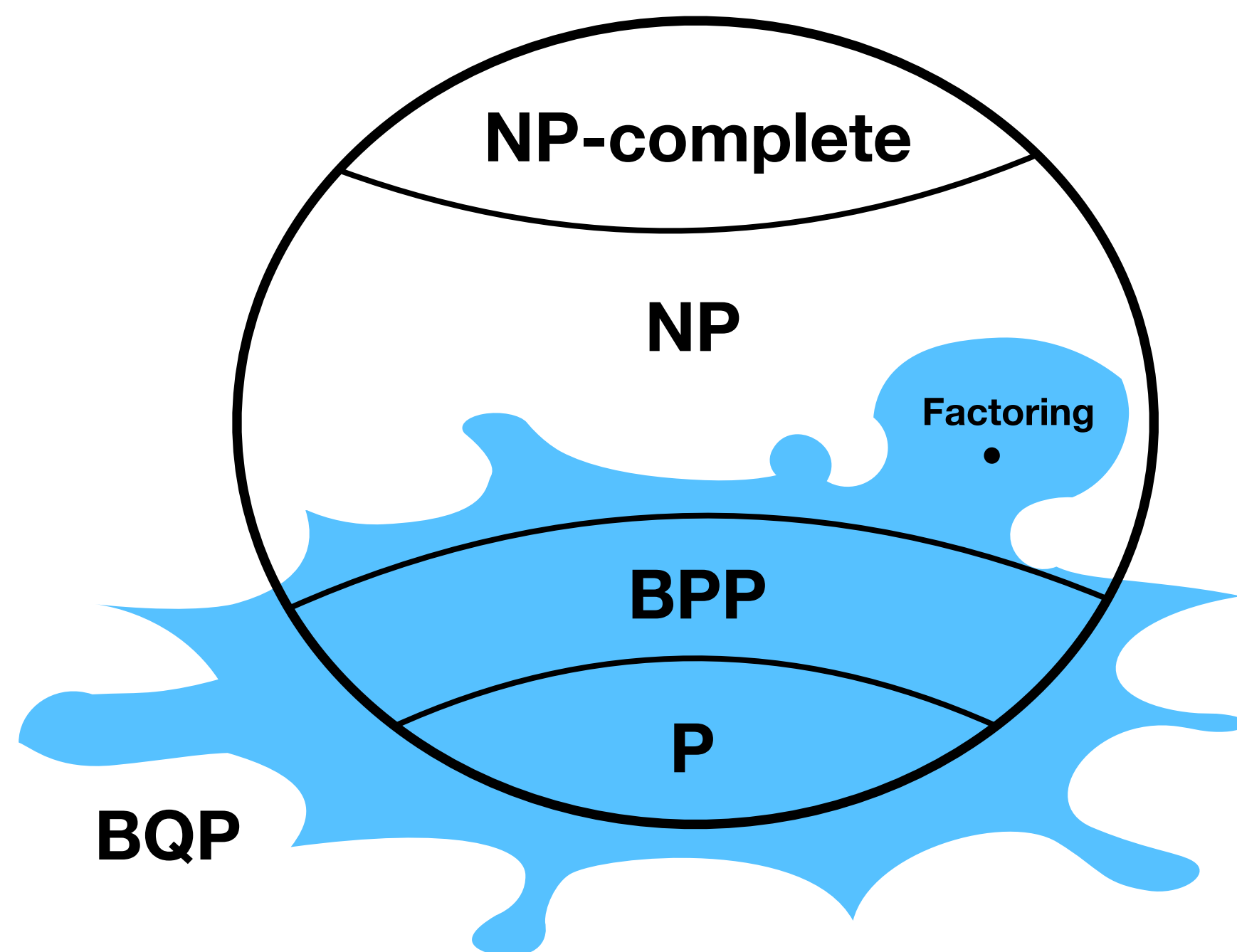


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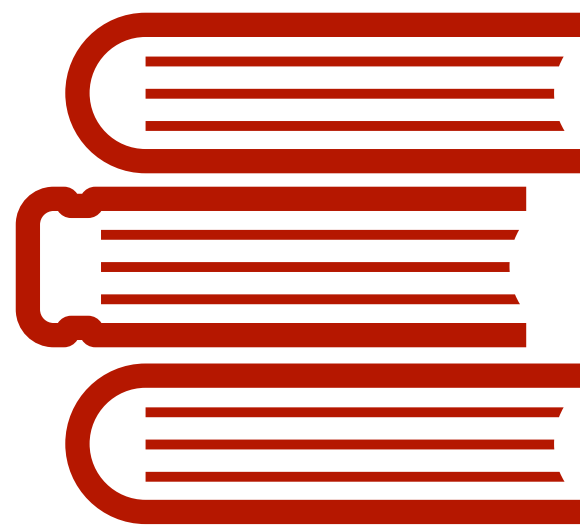
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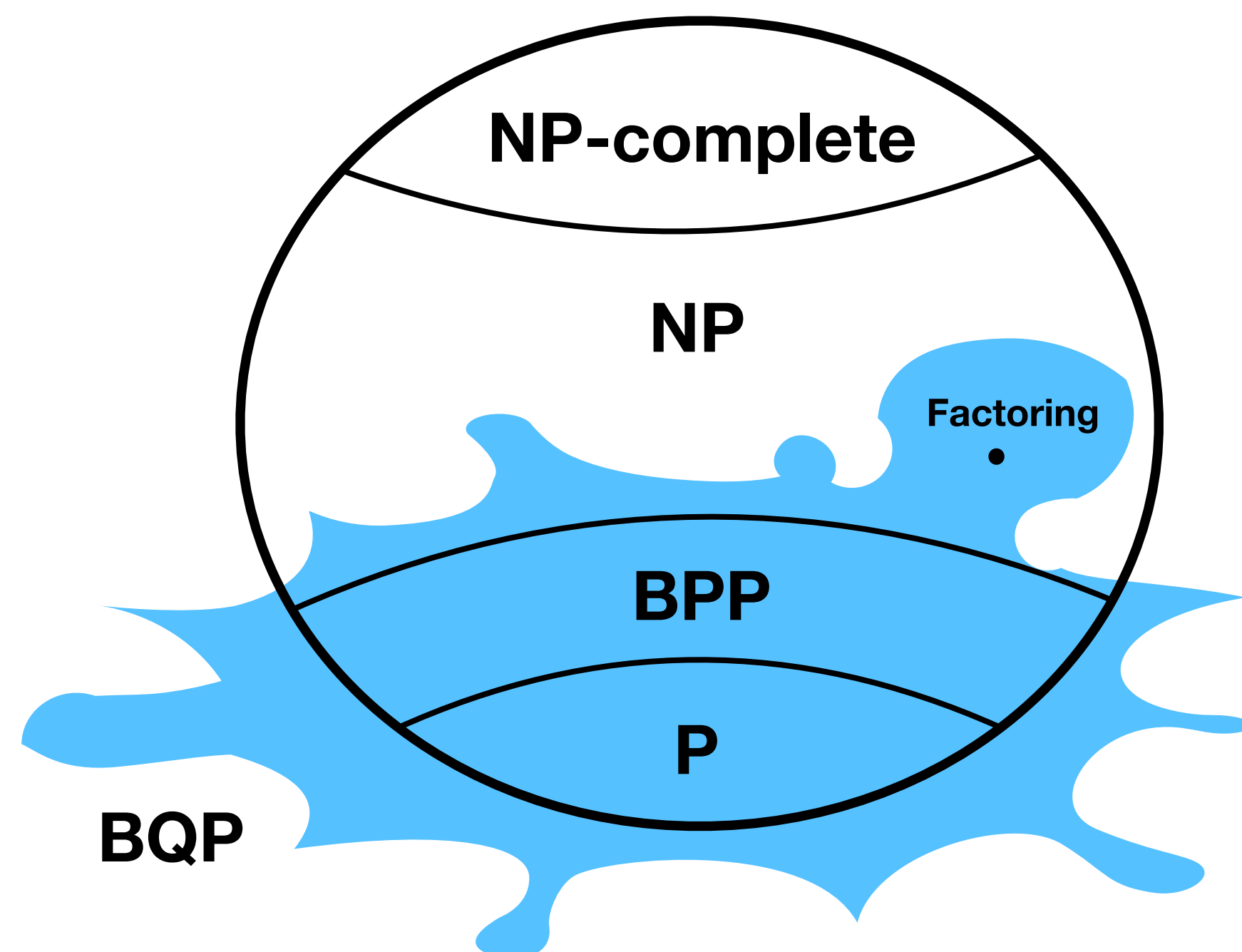
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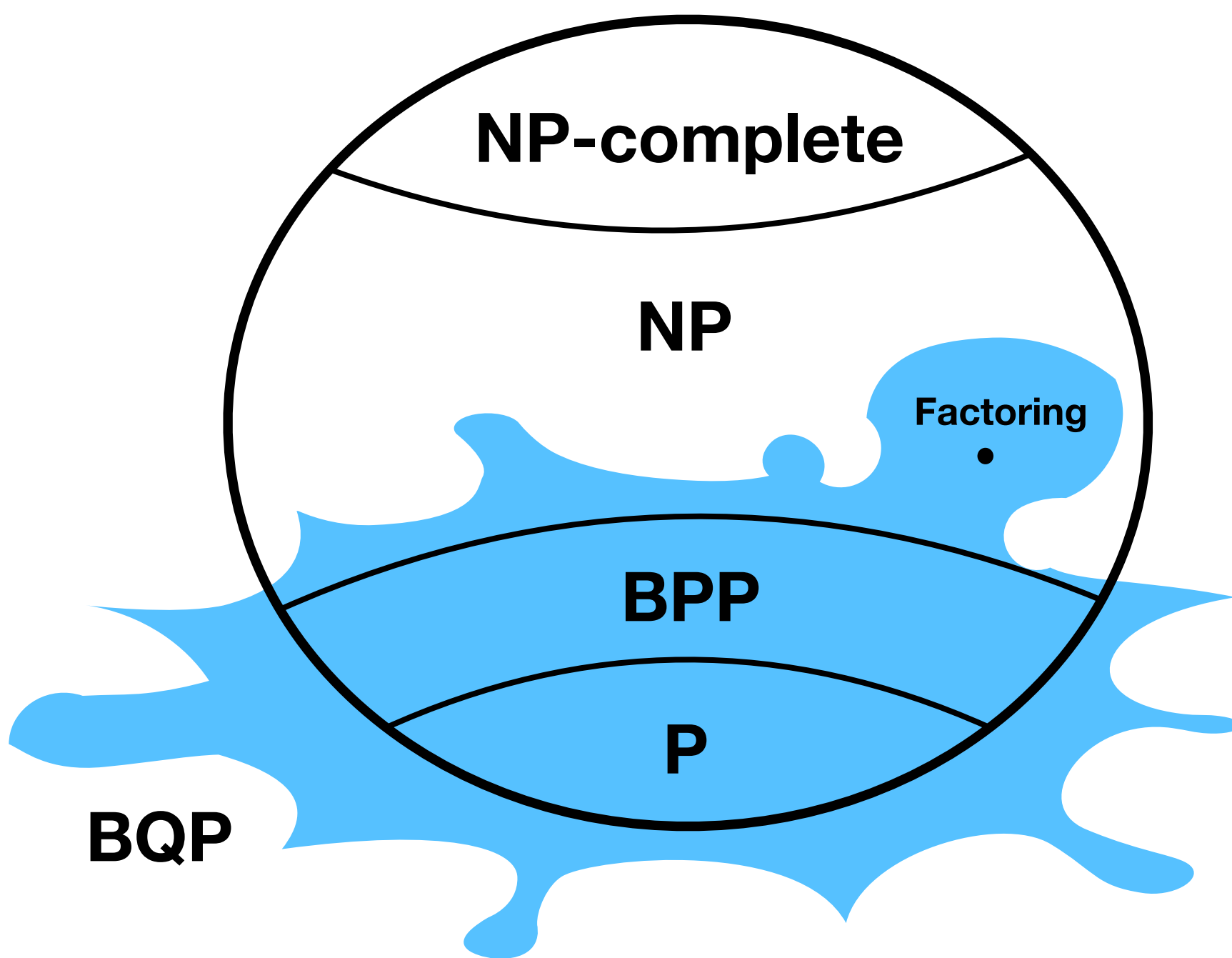
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**Q:** Is BQP realizable? Does quantum computation break ECTT?

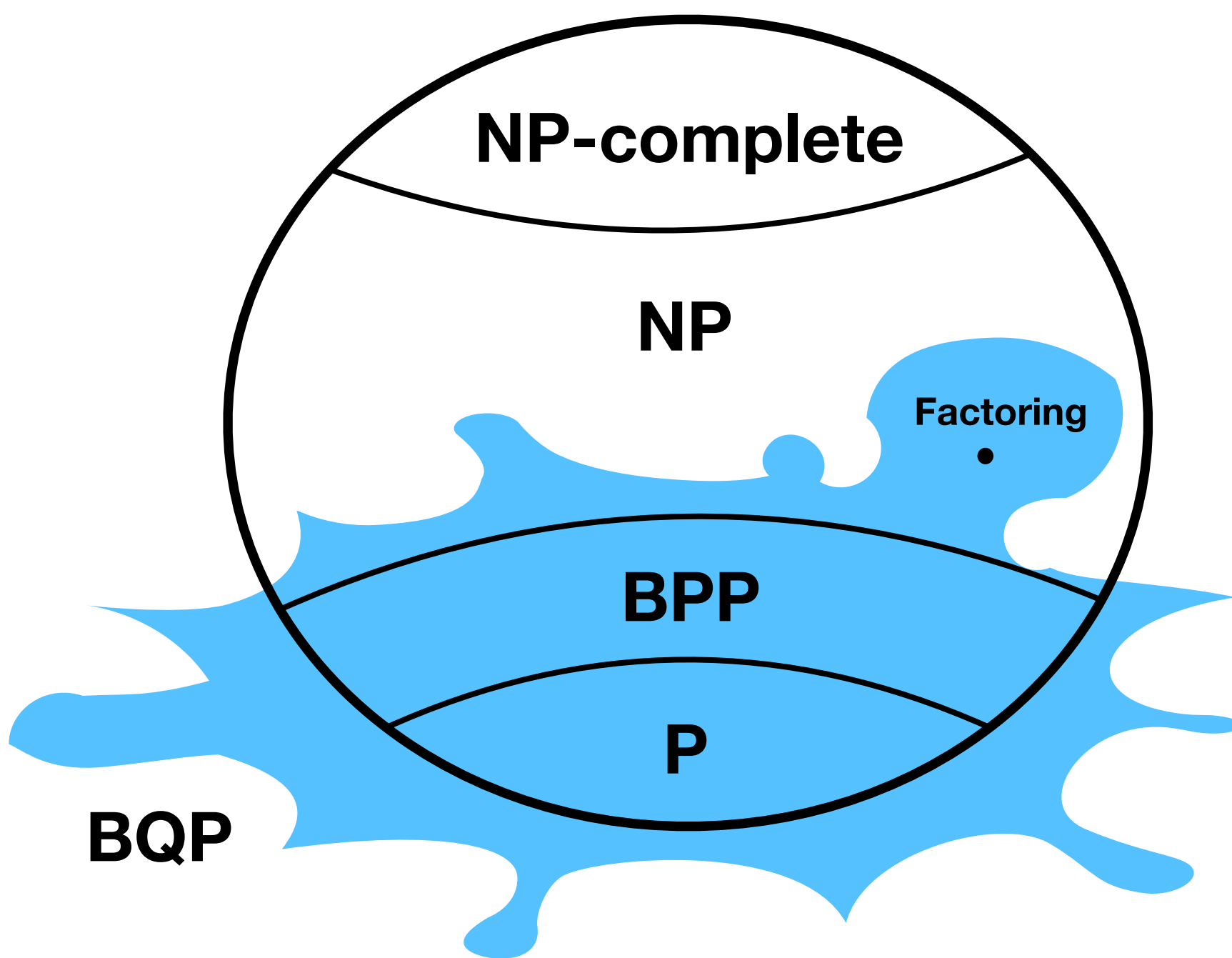
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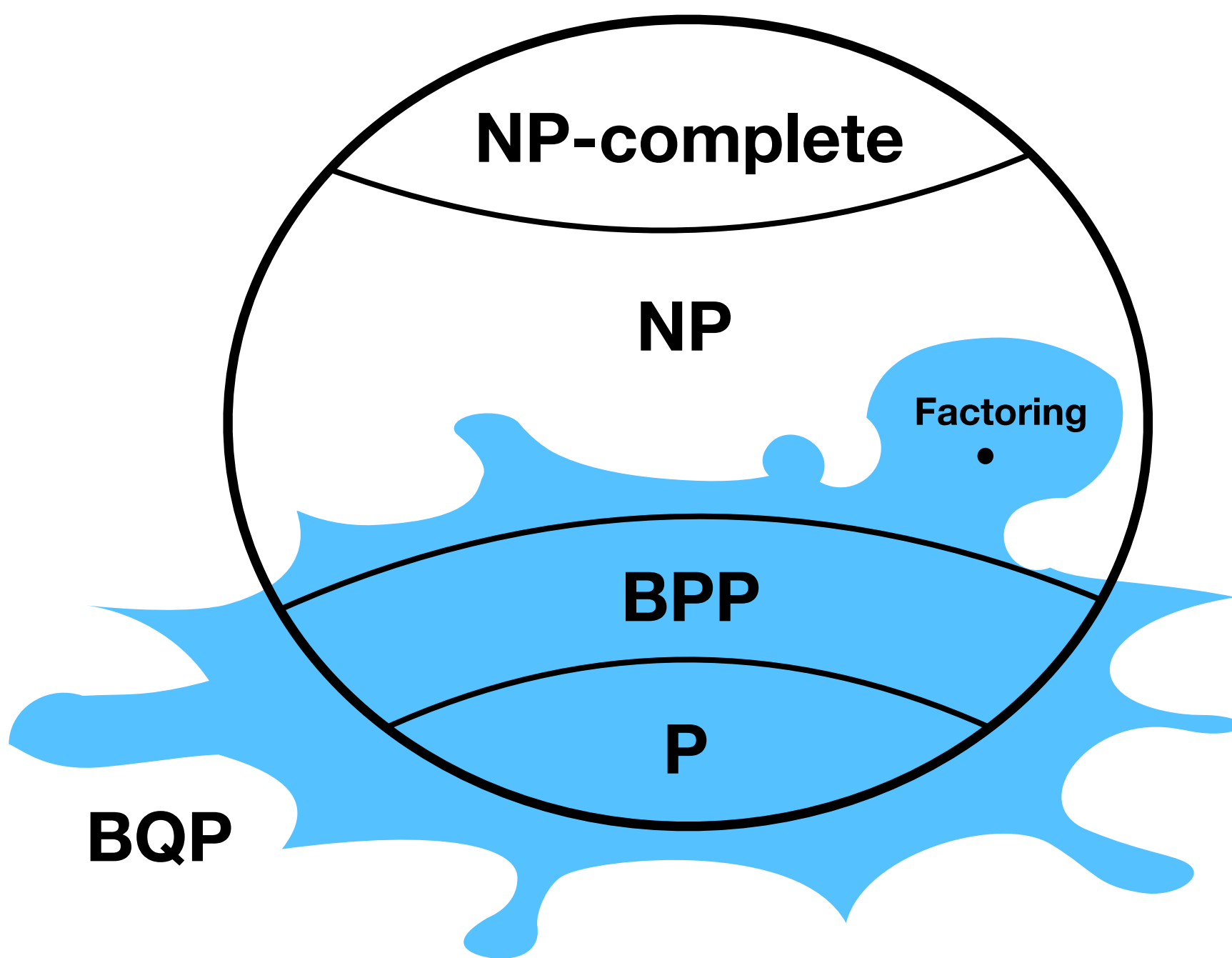


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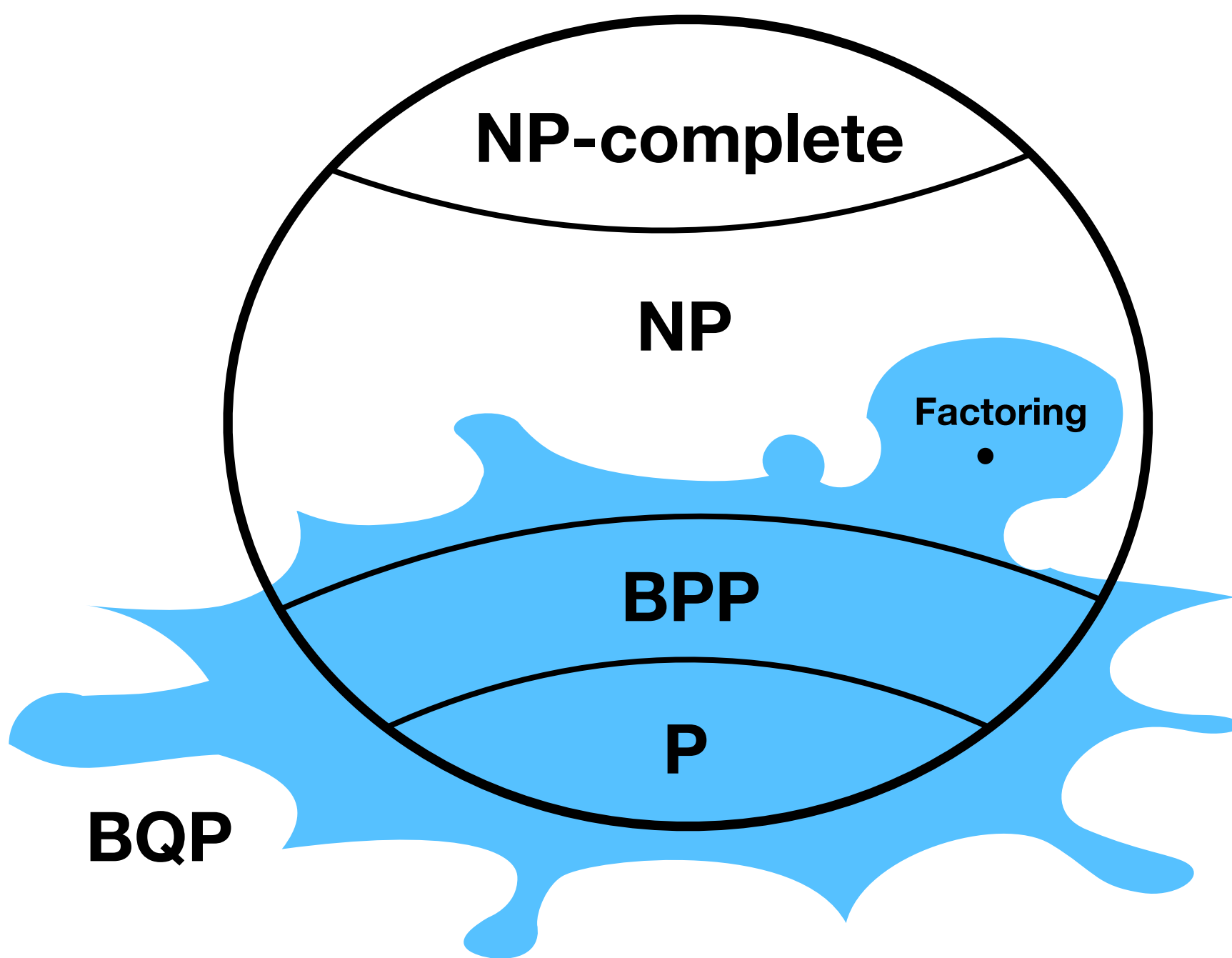


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**Q:** Can we refute ECTT with near-term technology?

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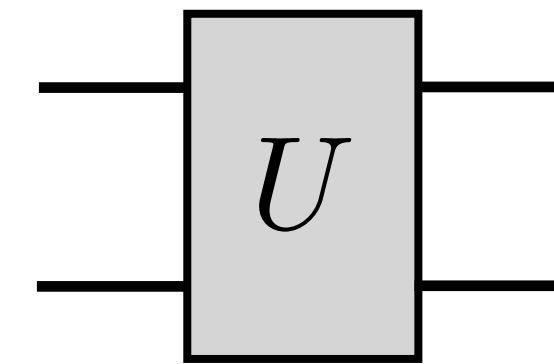
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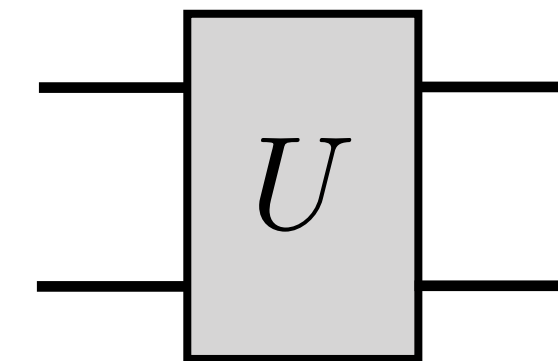
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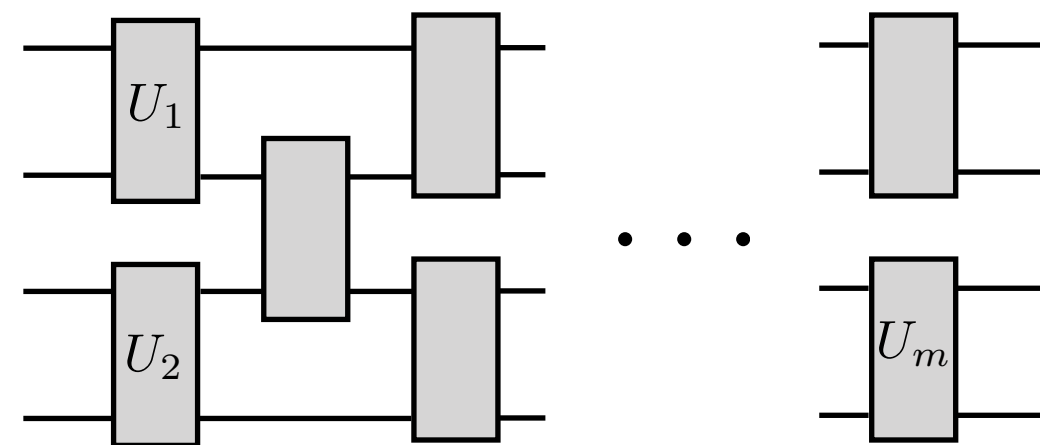


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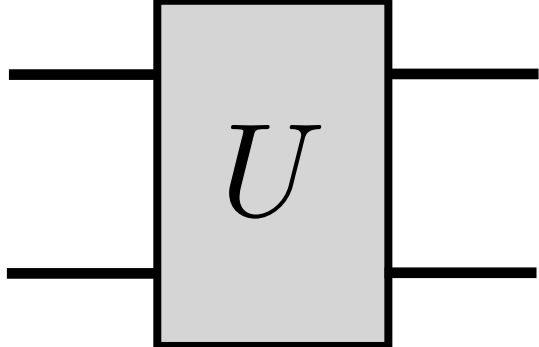
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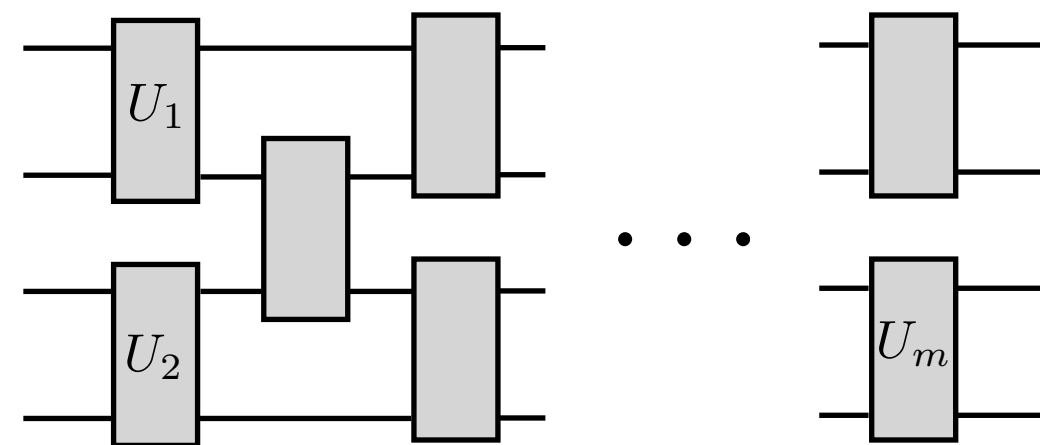


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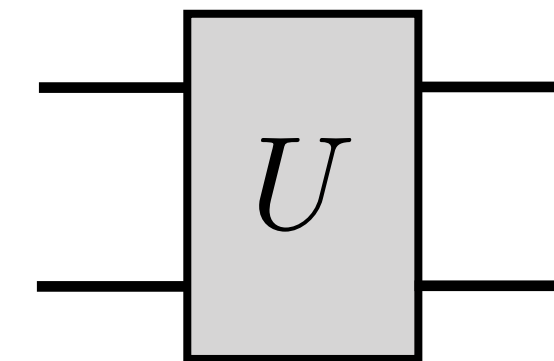
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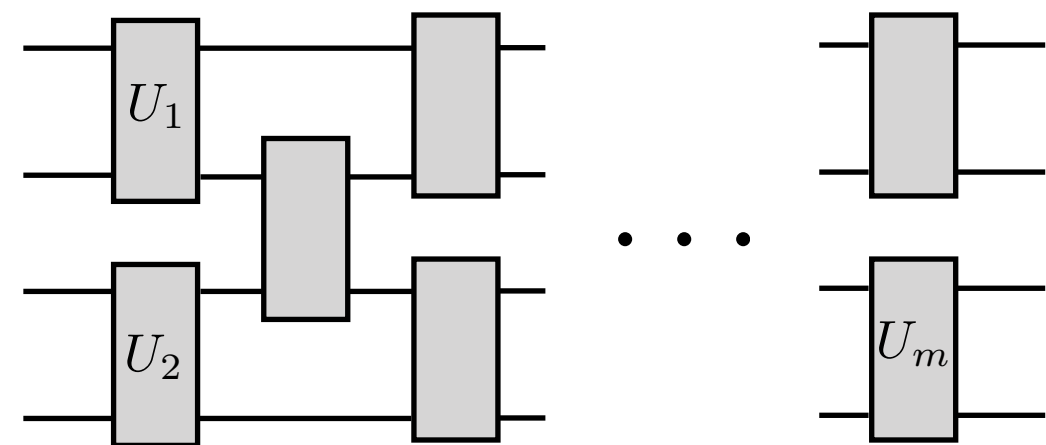


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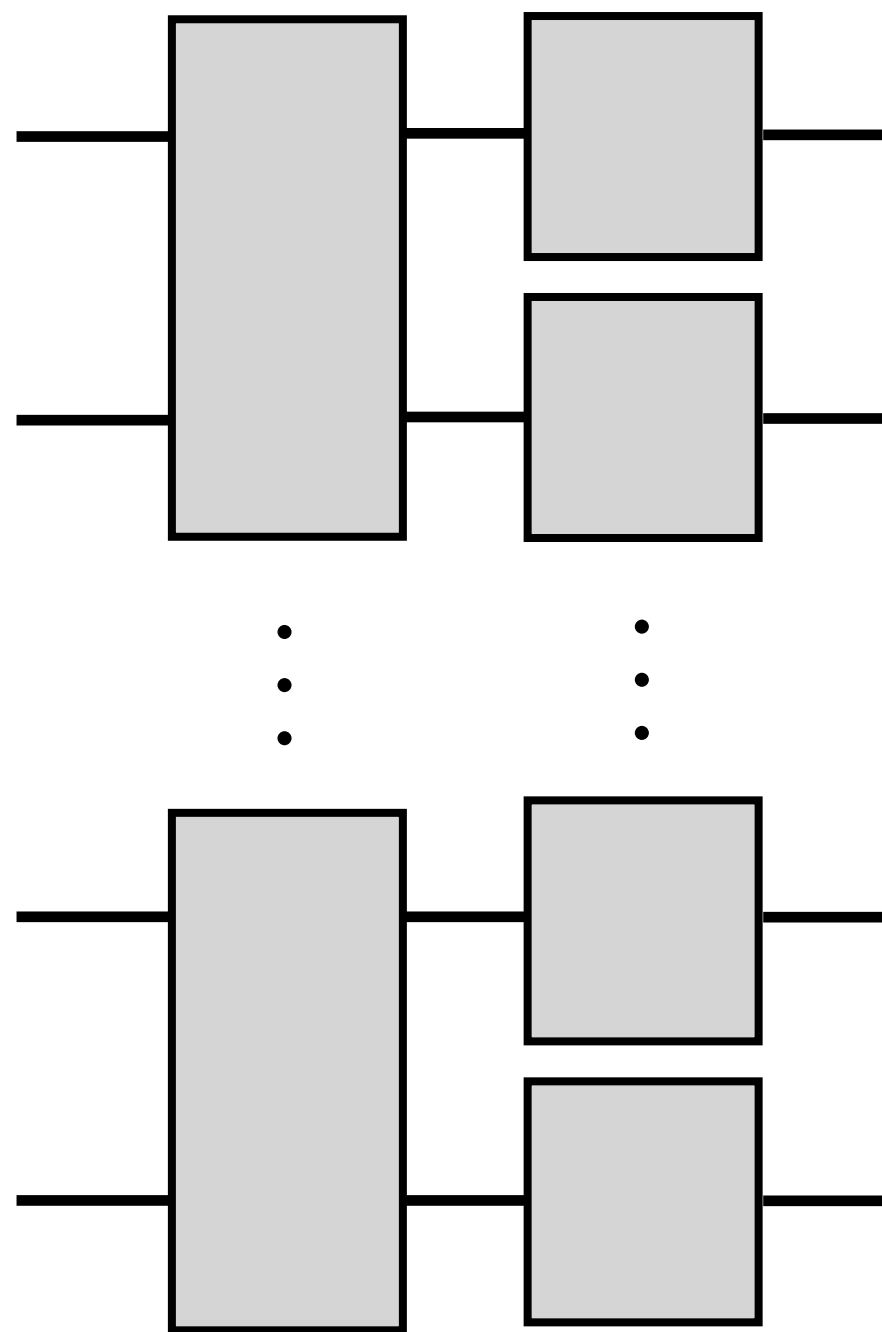
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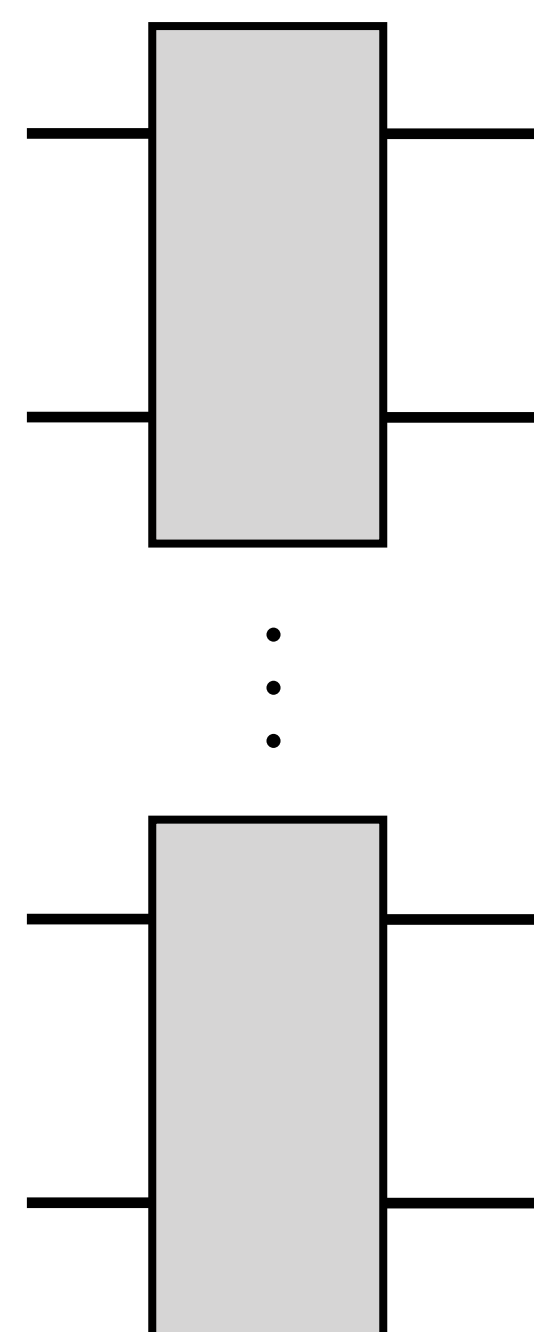
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*The lead-candidate used by Google's Sycamore*



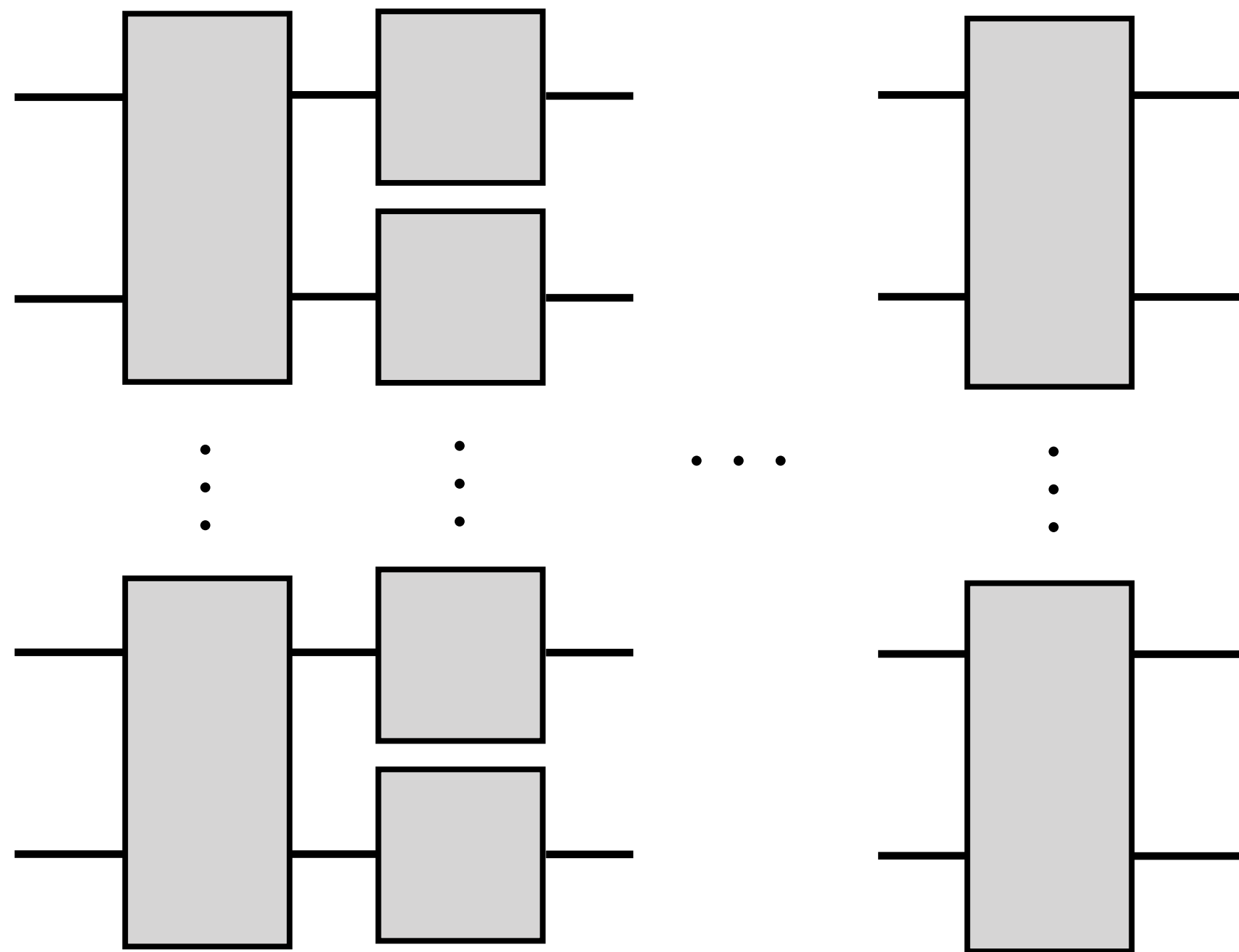
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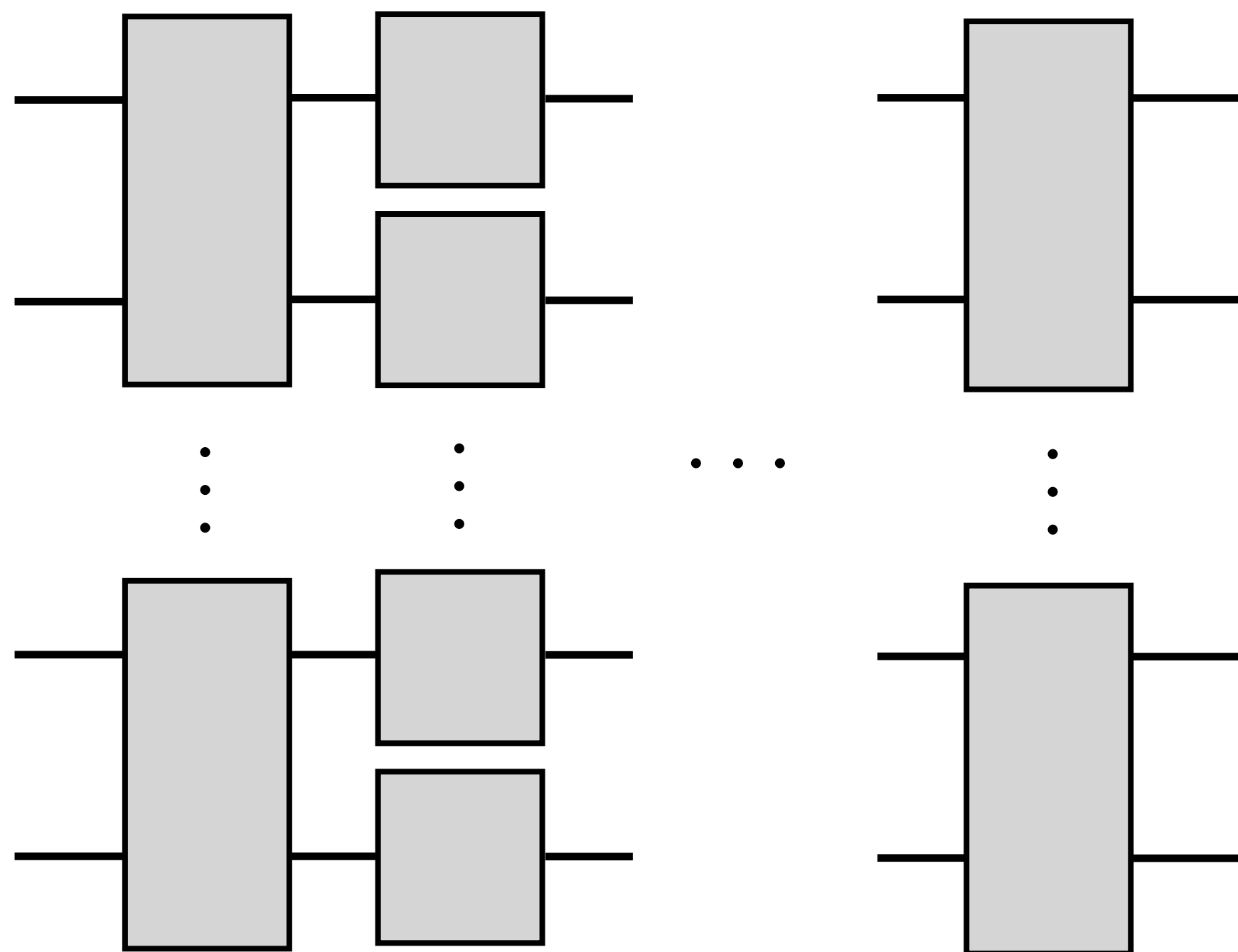


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(E.g., Quantum skeptics)

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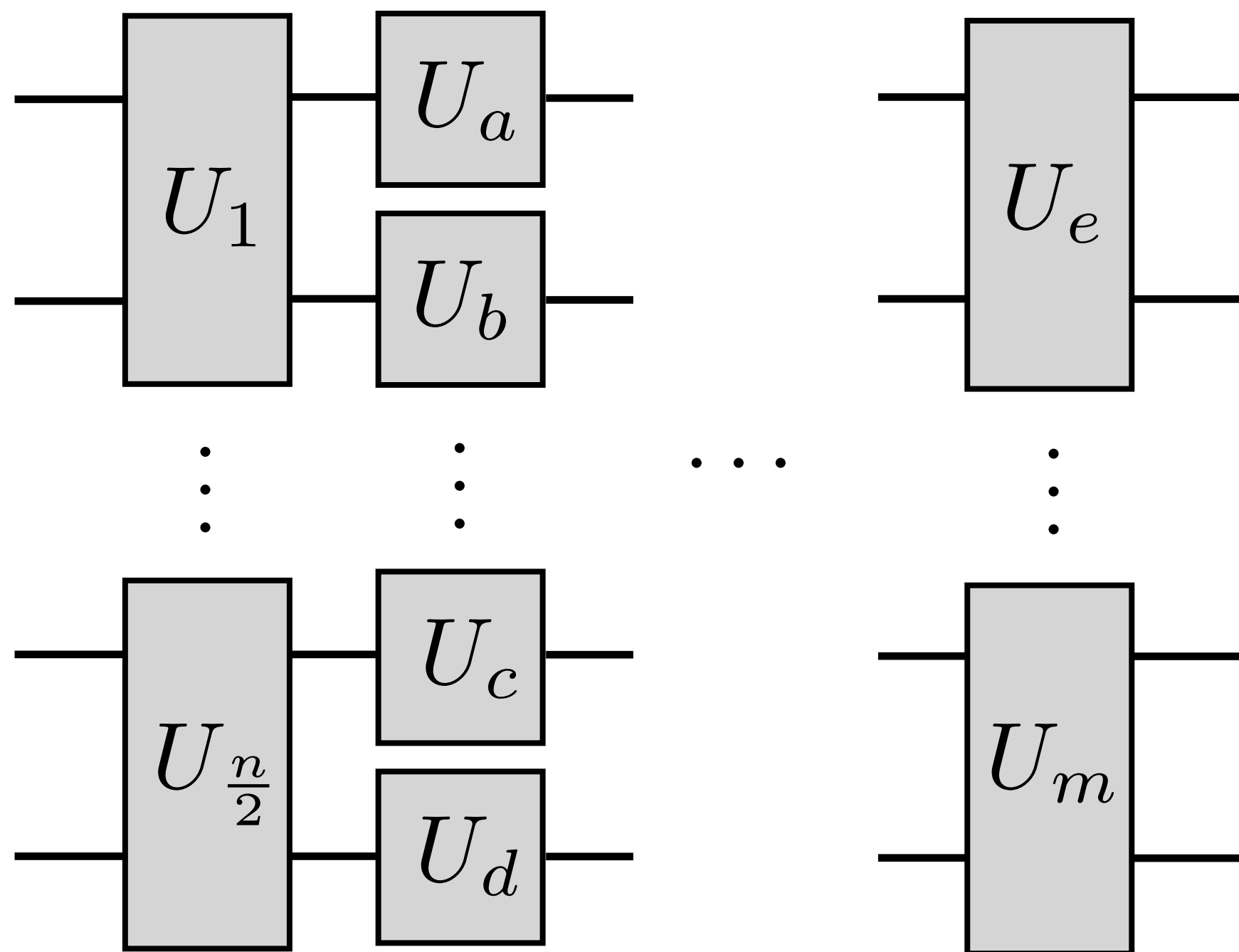
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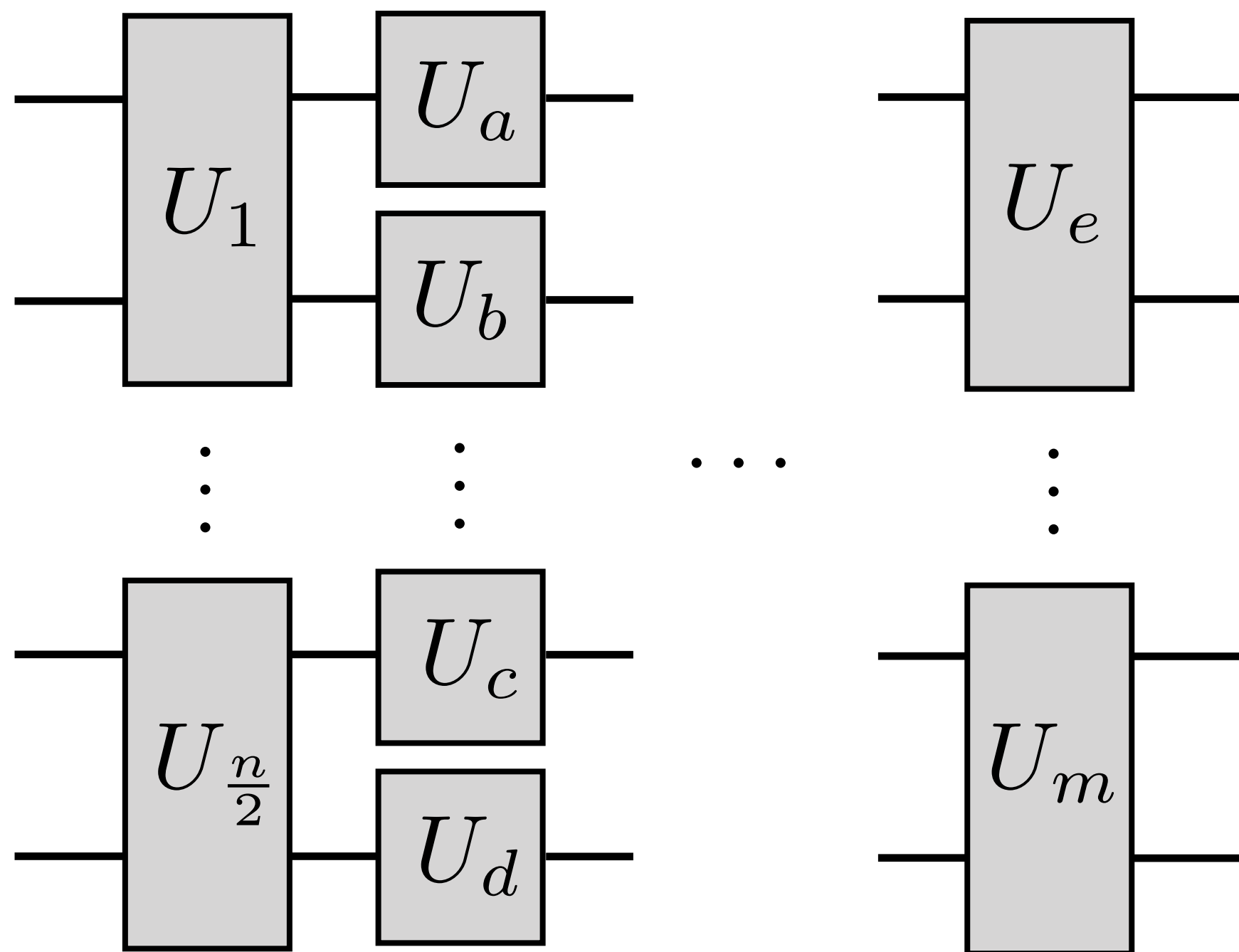
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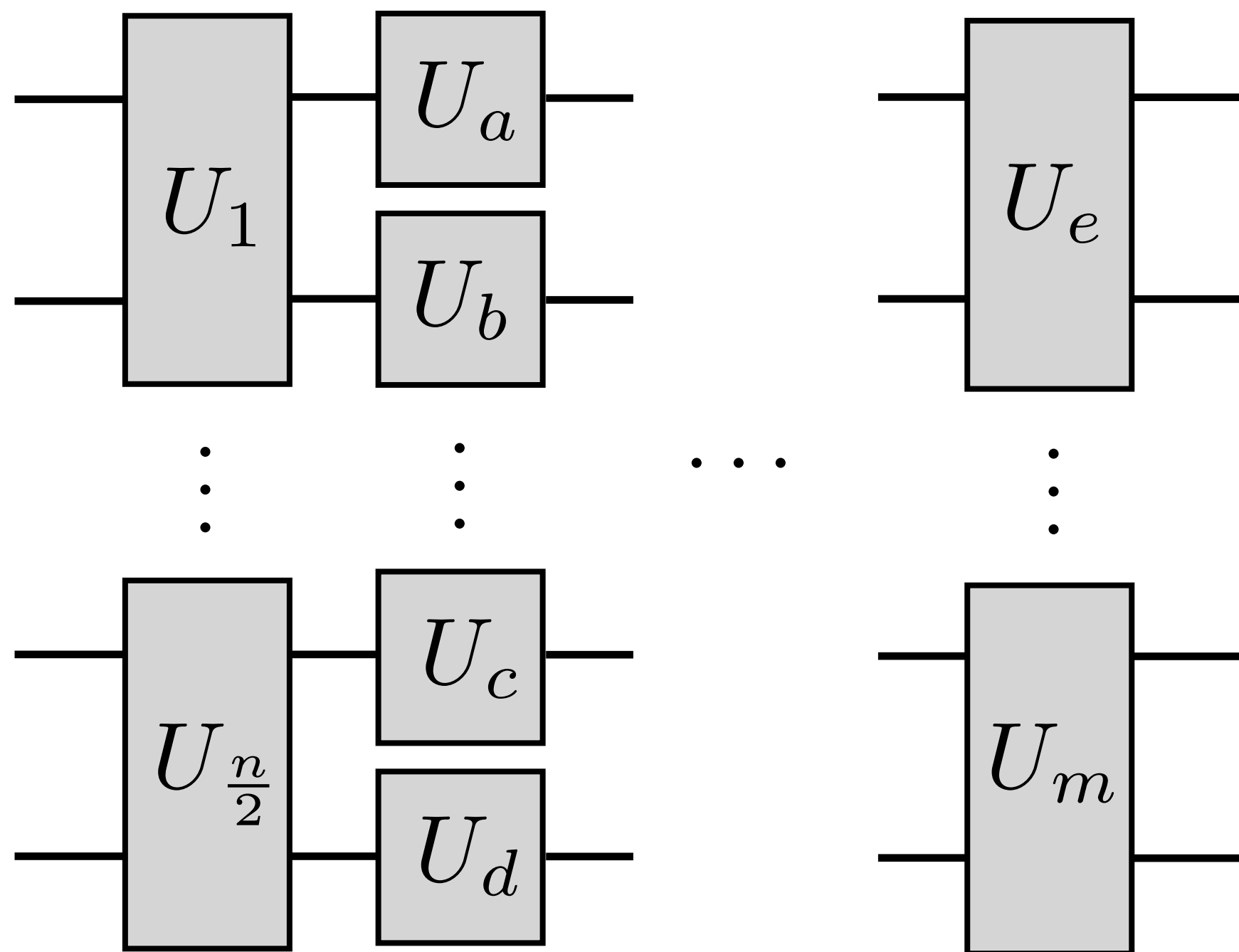
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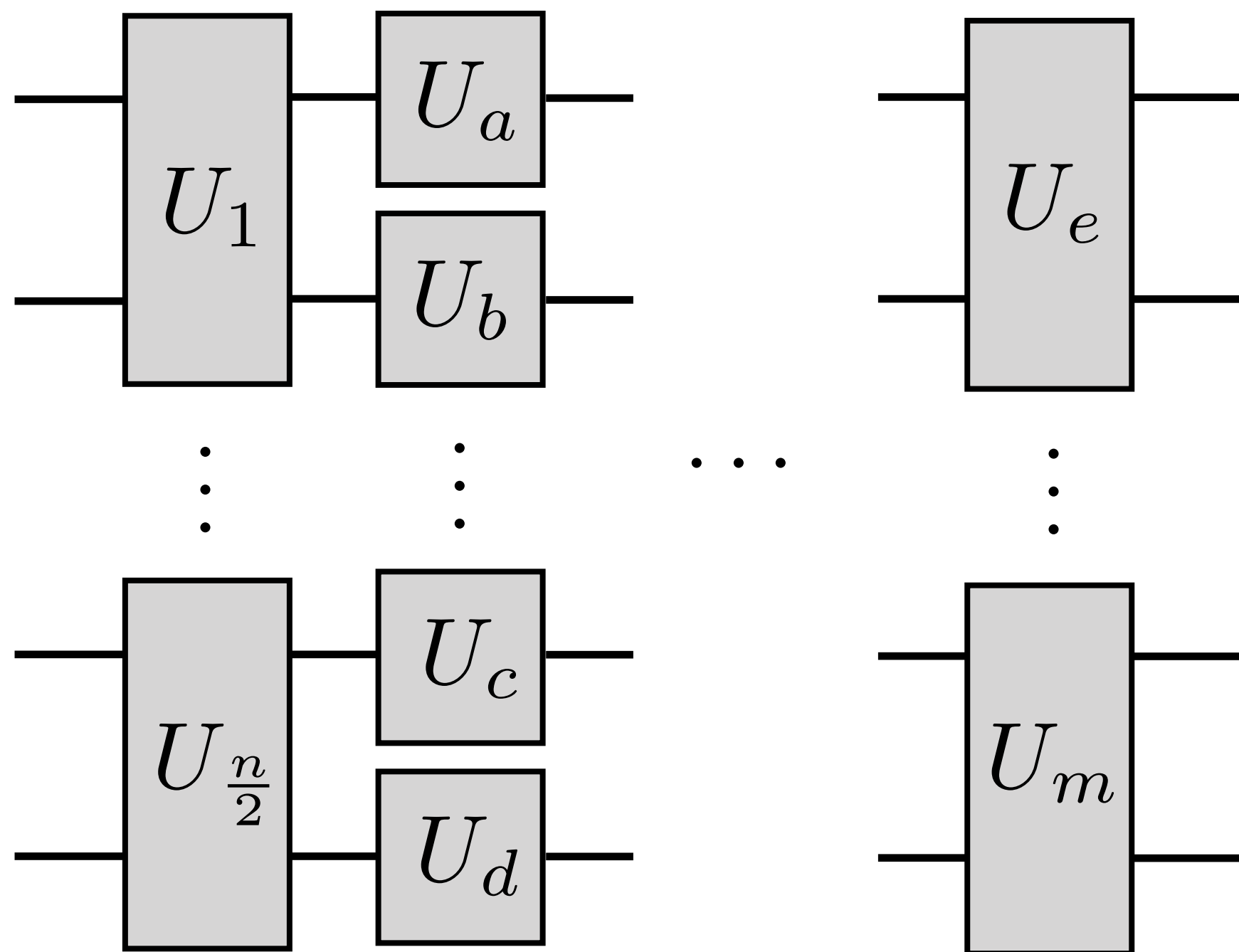
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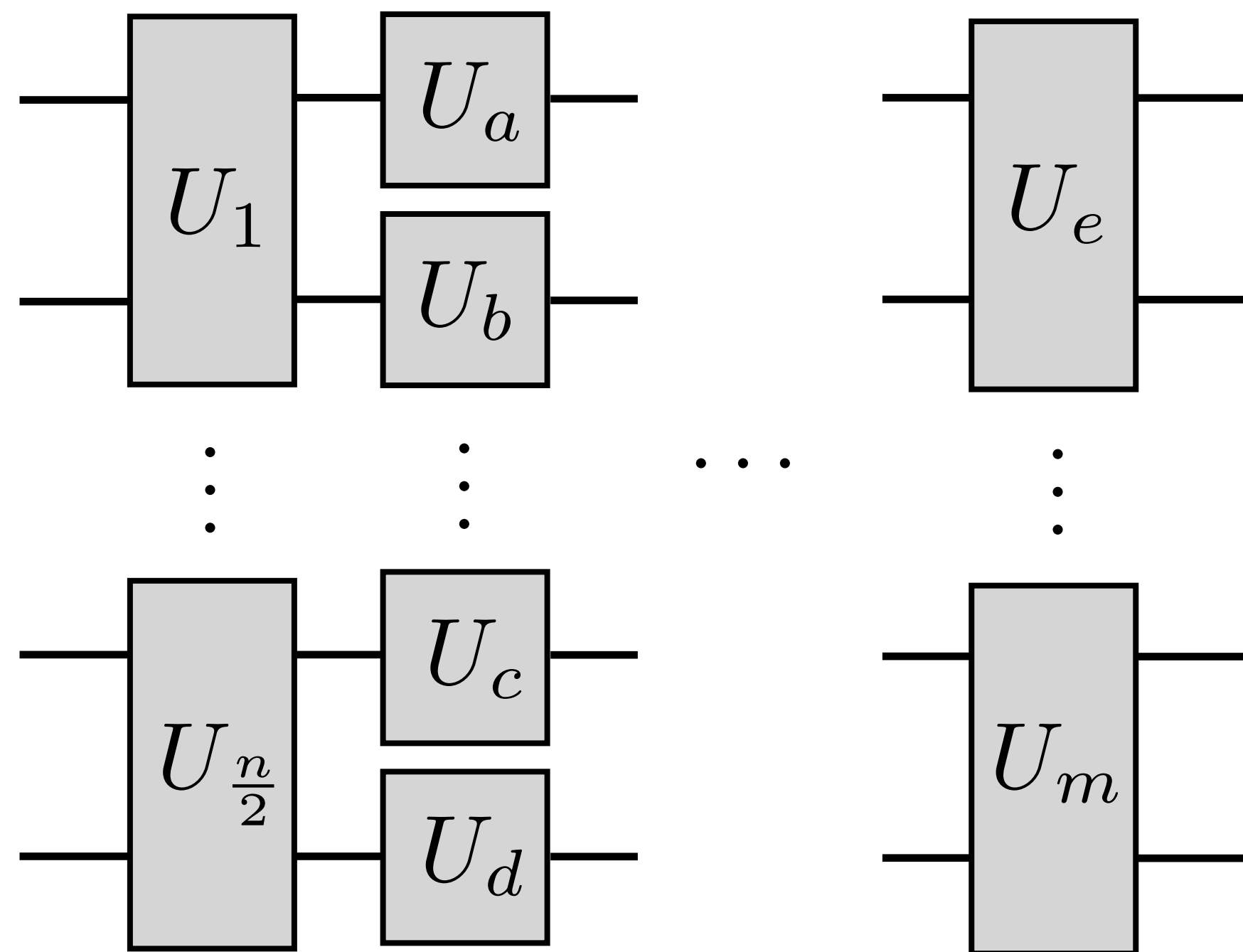
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**Intuition:** Without quantumness, the prover requires exponential time!?

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- **Efficiency:** The verification should be scalable.
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- **Soundness:** If the distribution came from a classical device, then reject w.h.p.

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*A statistic for verifying RCS-based quantum supremacy*

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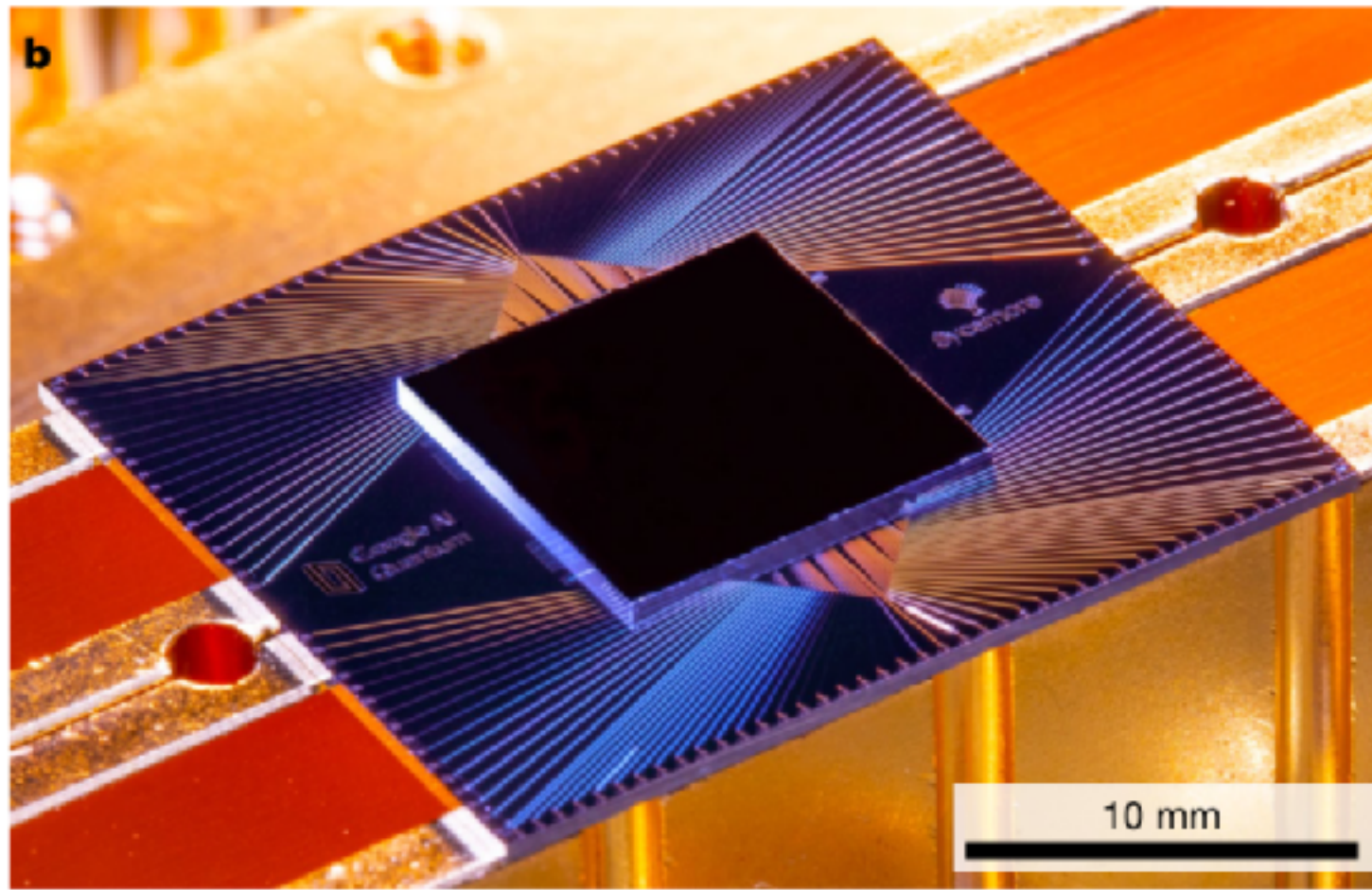
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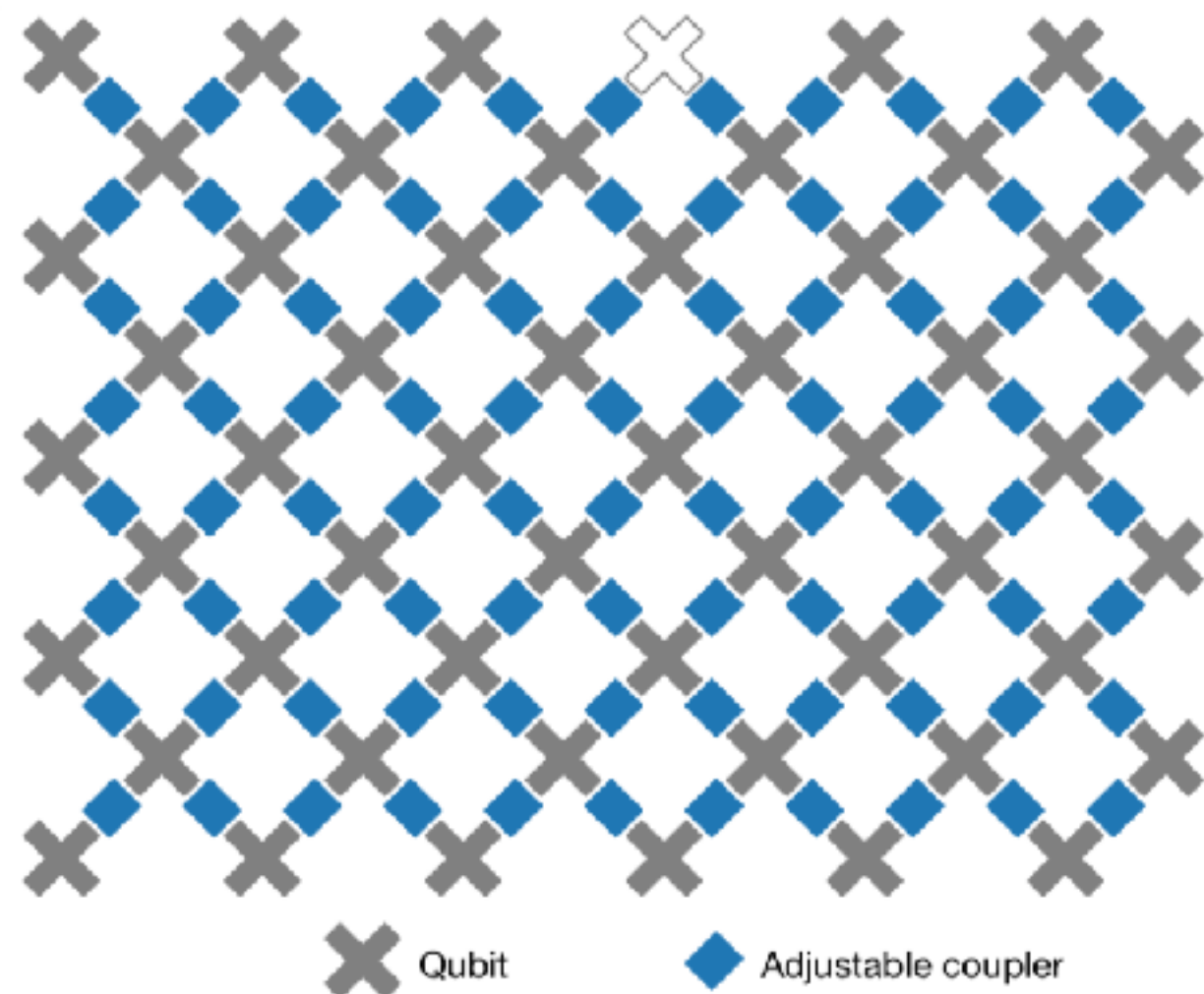
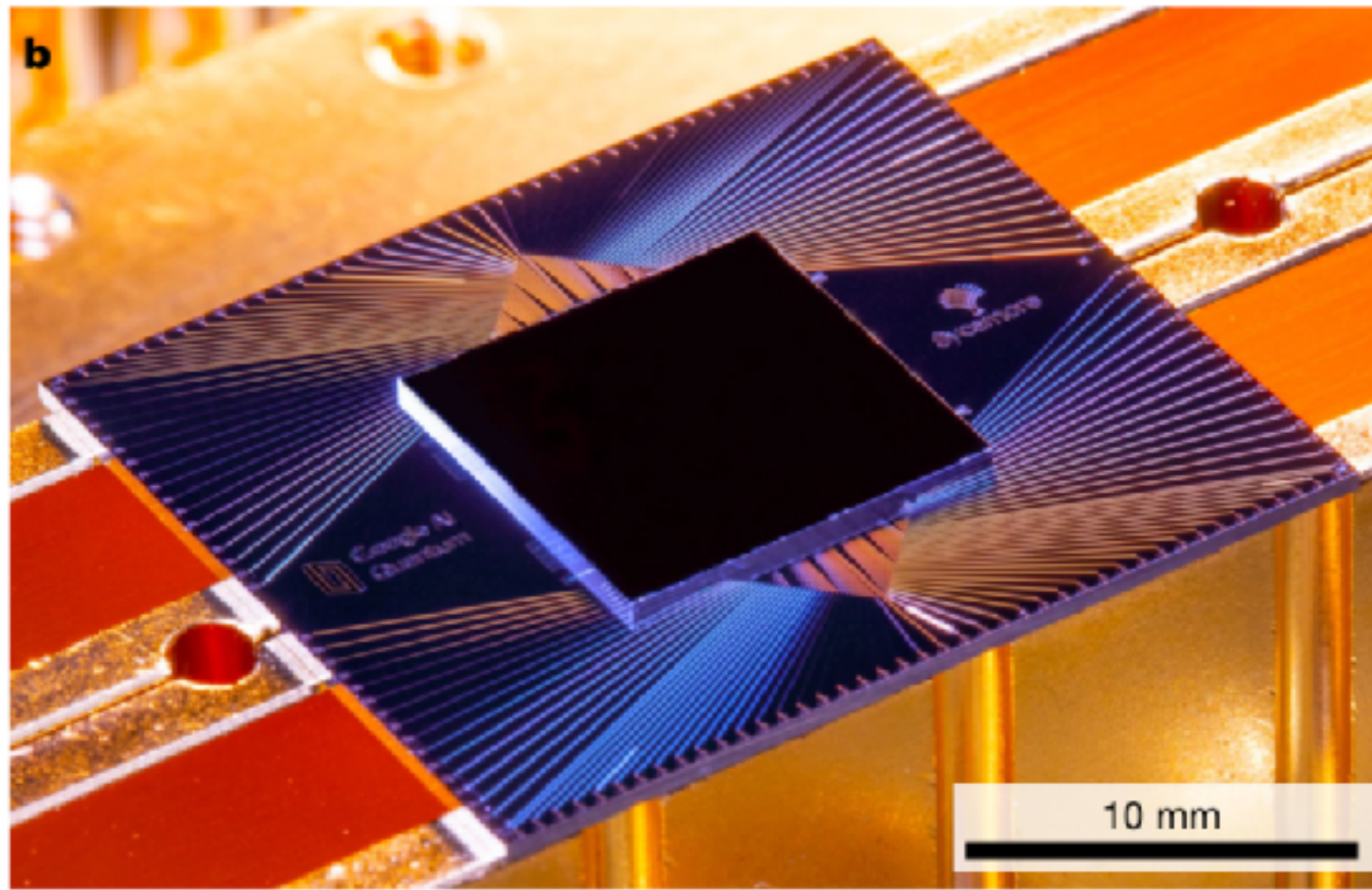
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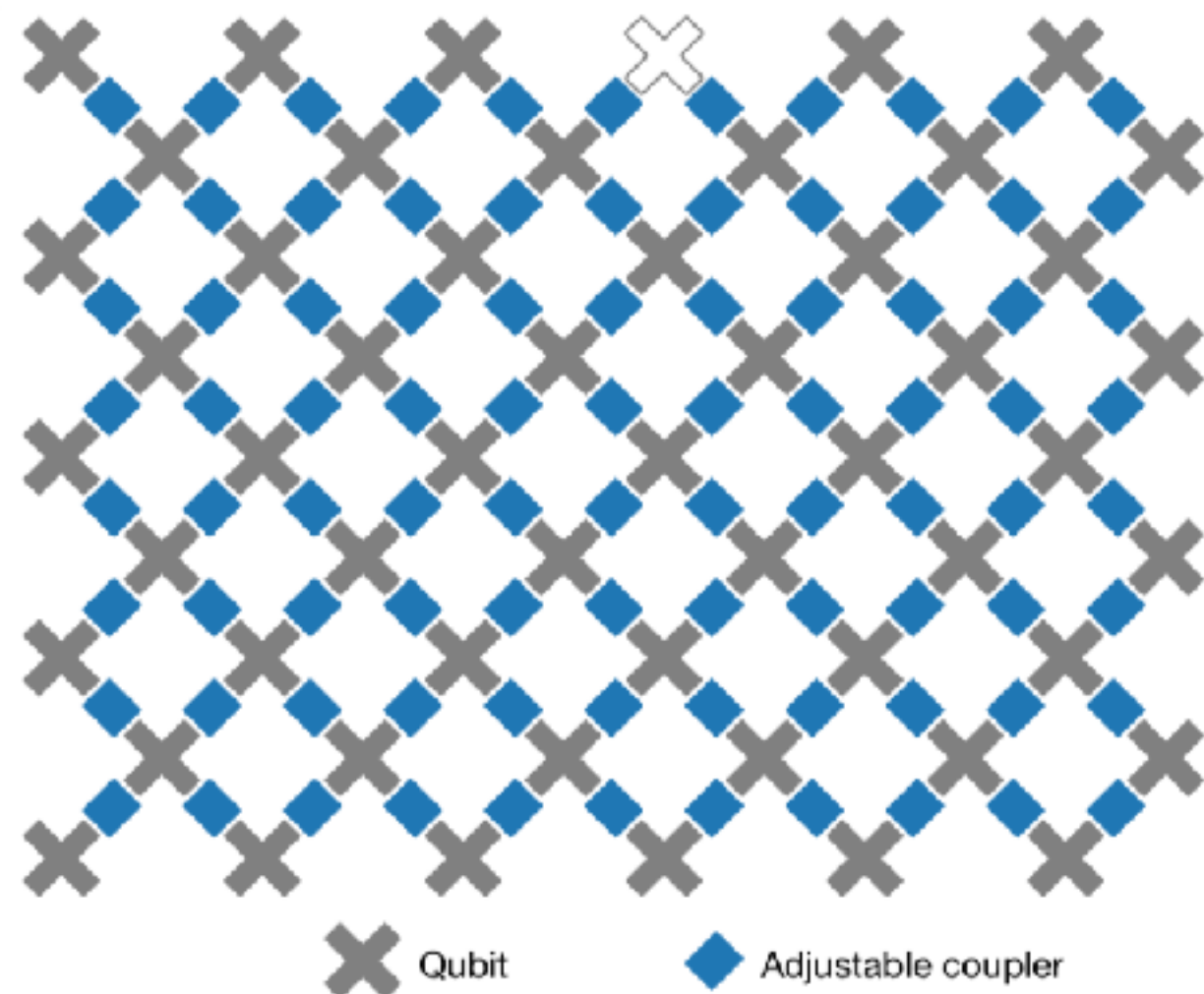
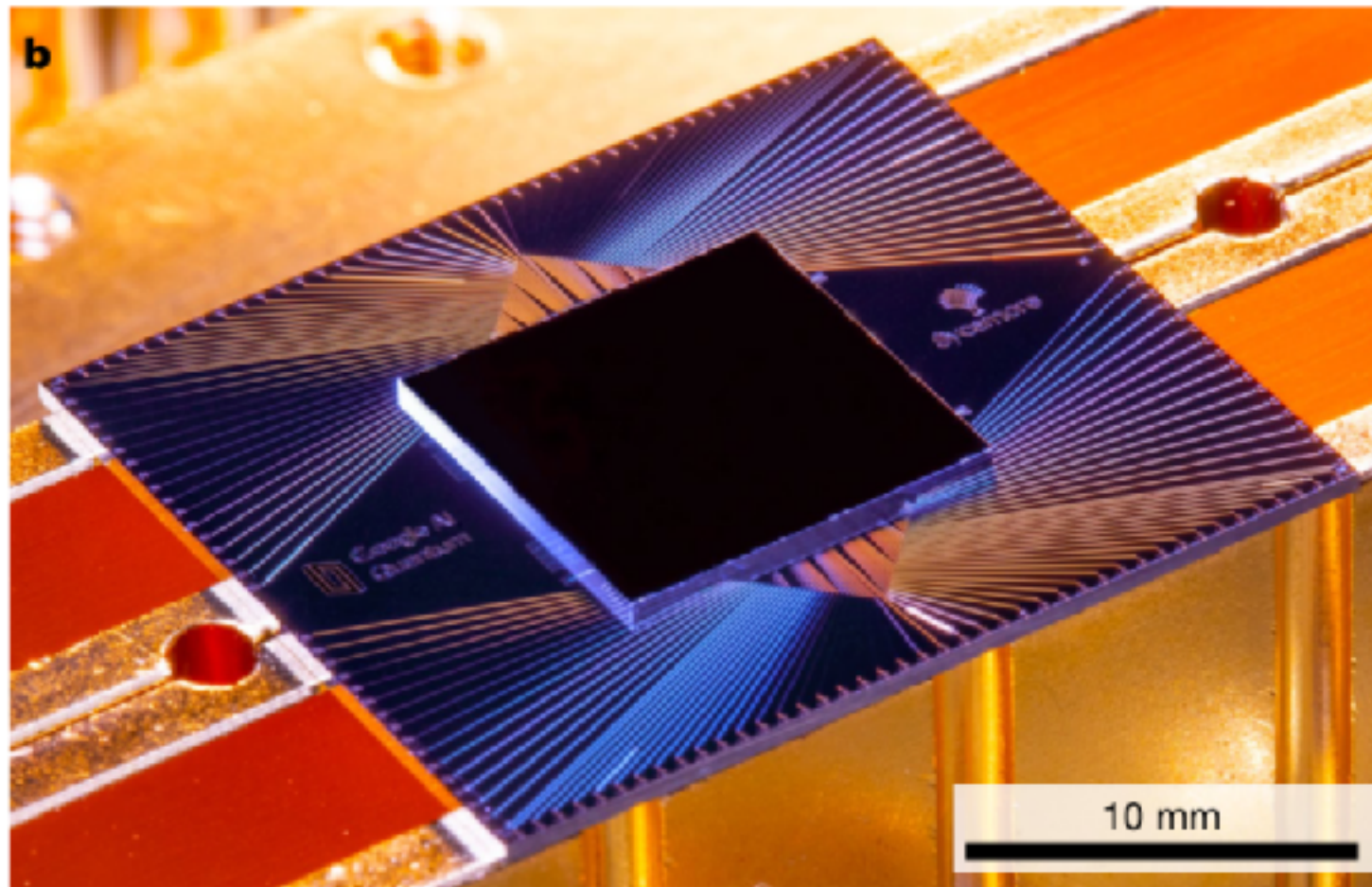


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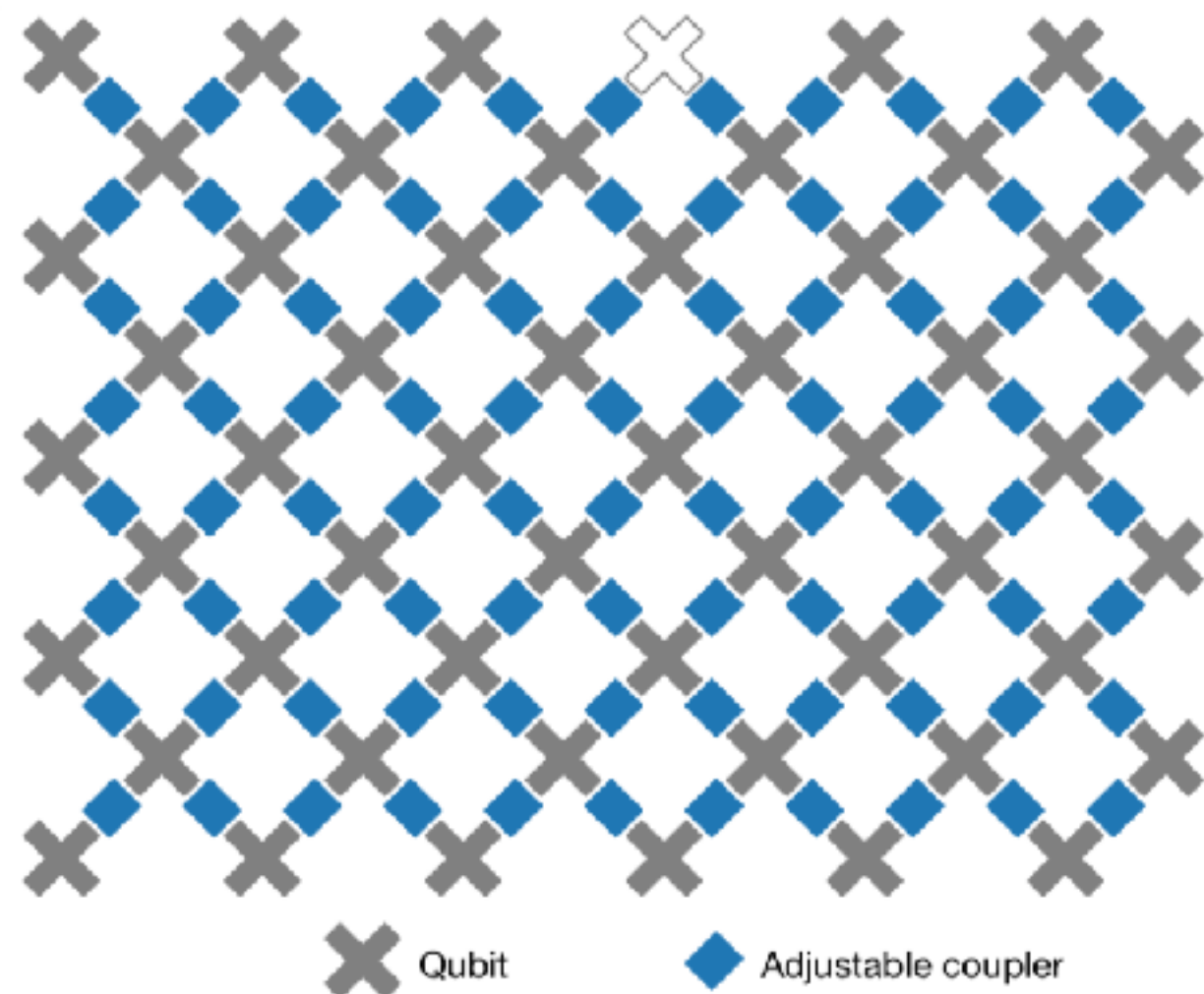
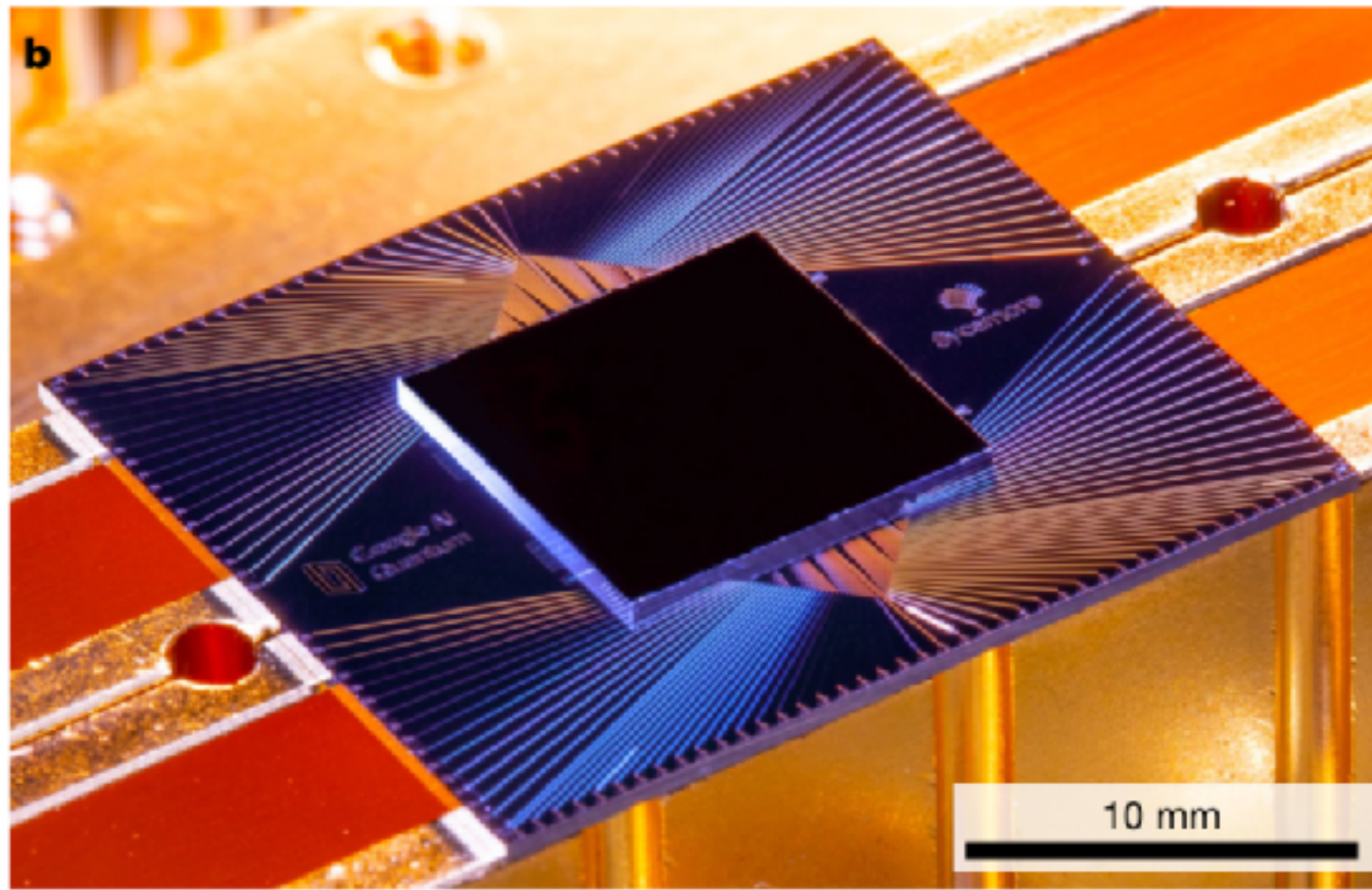
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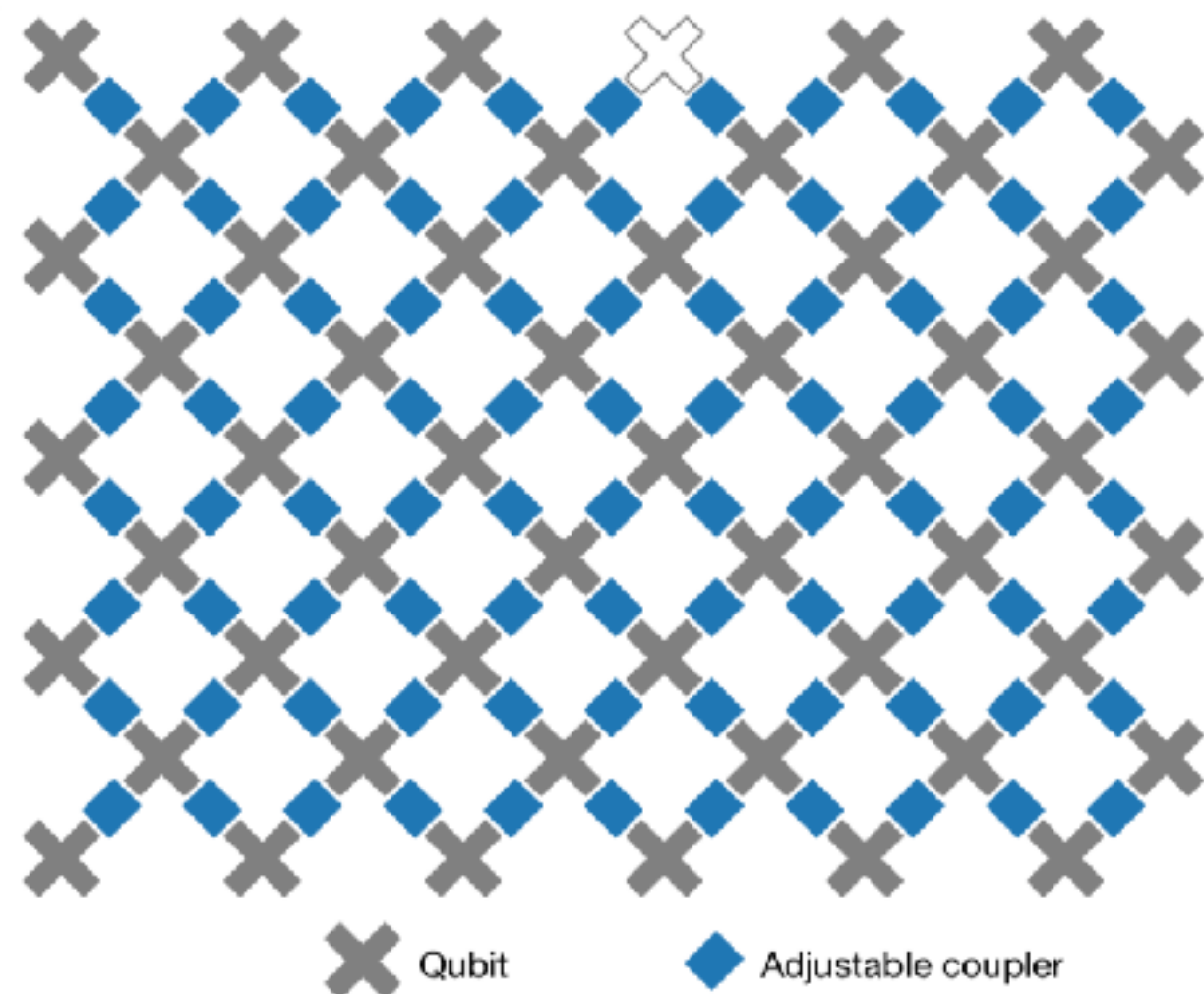
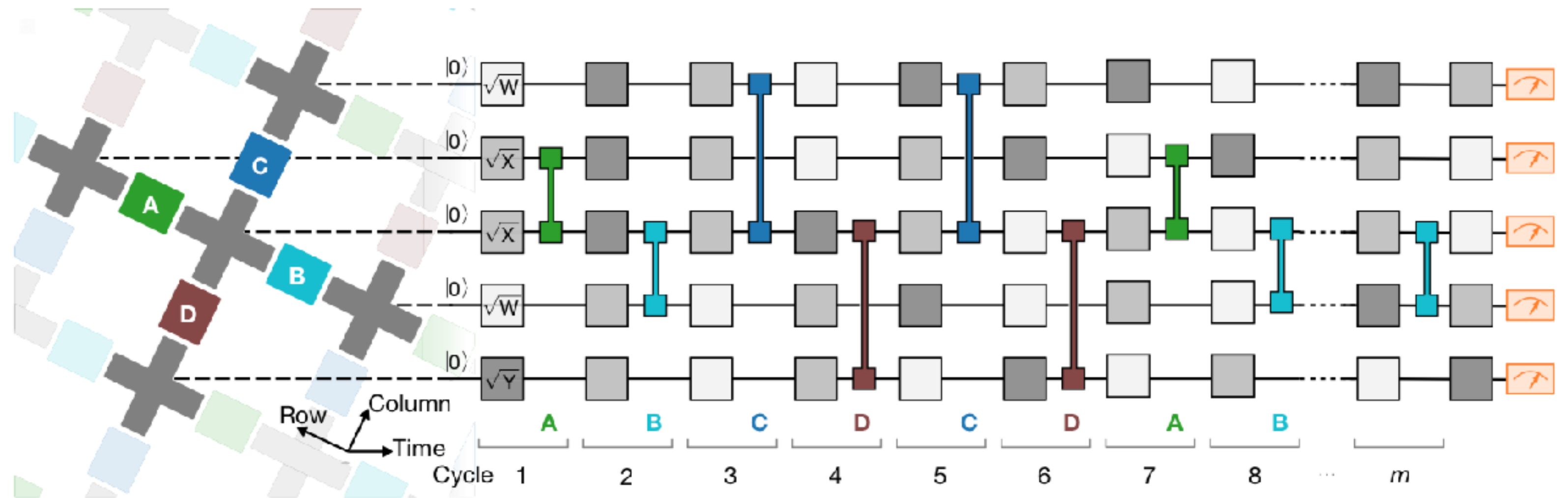
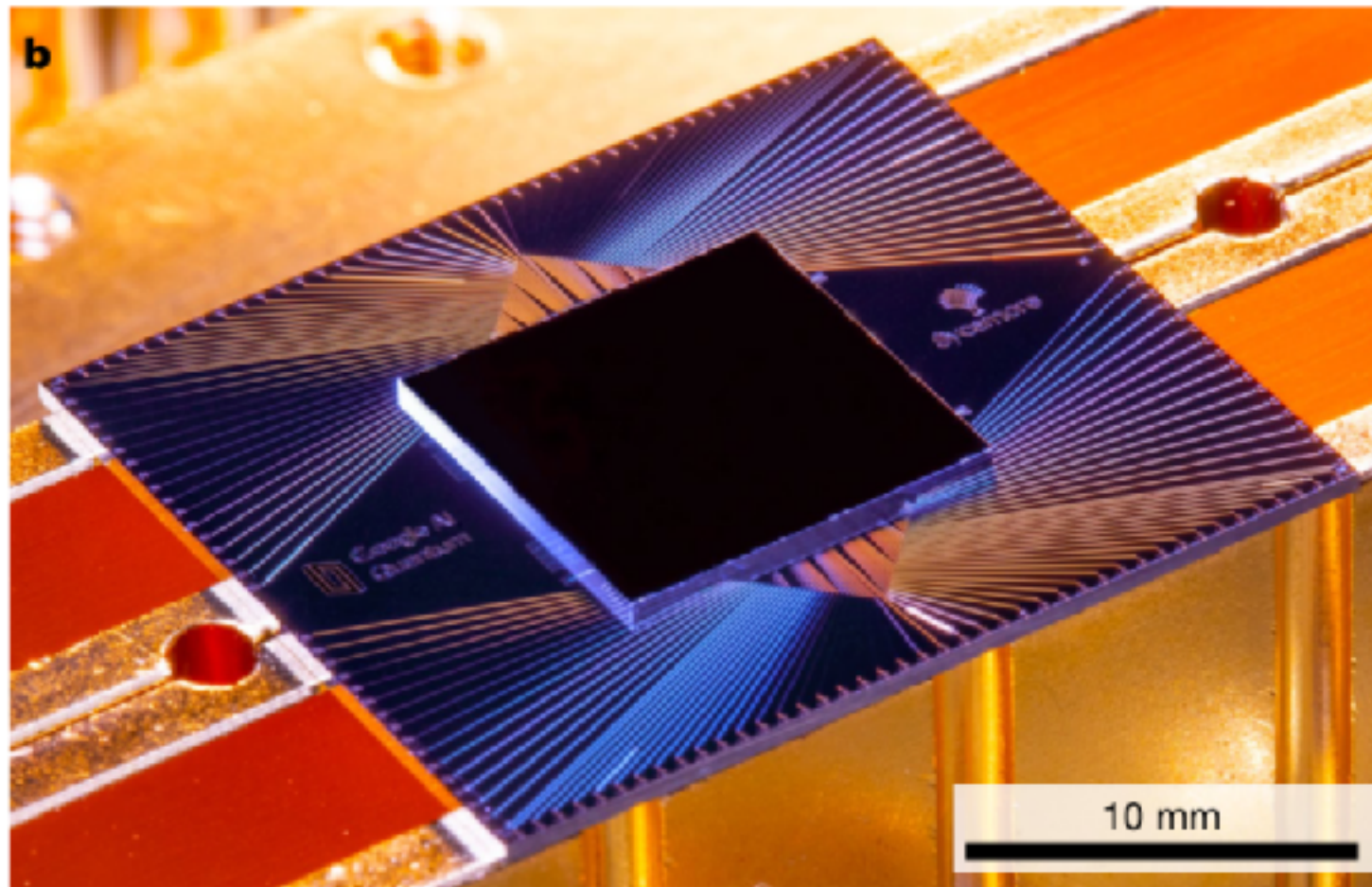
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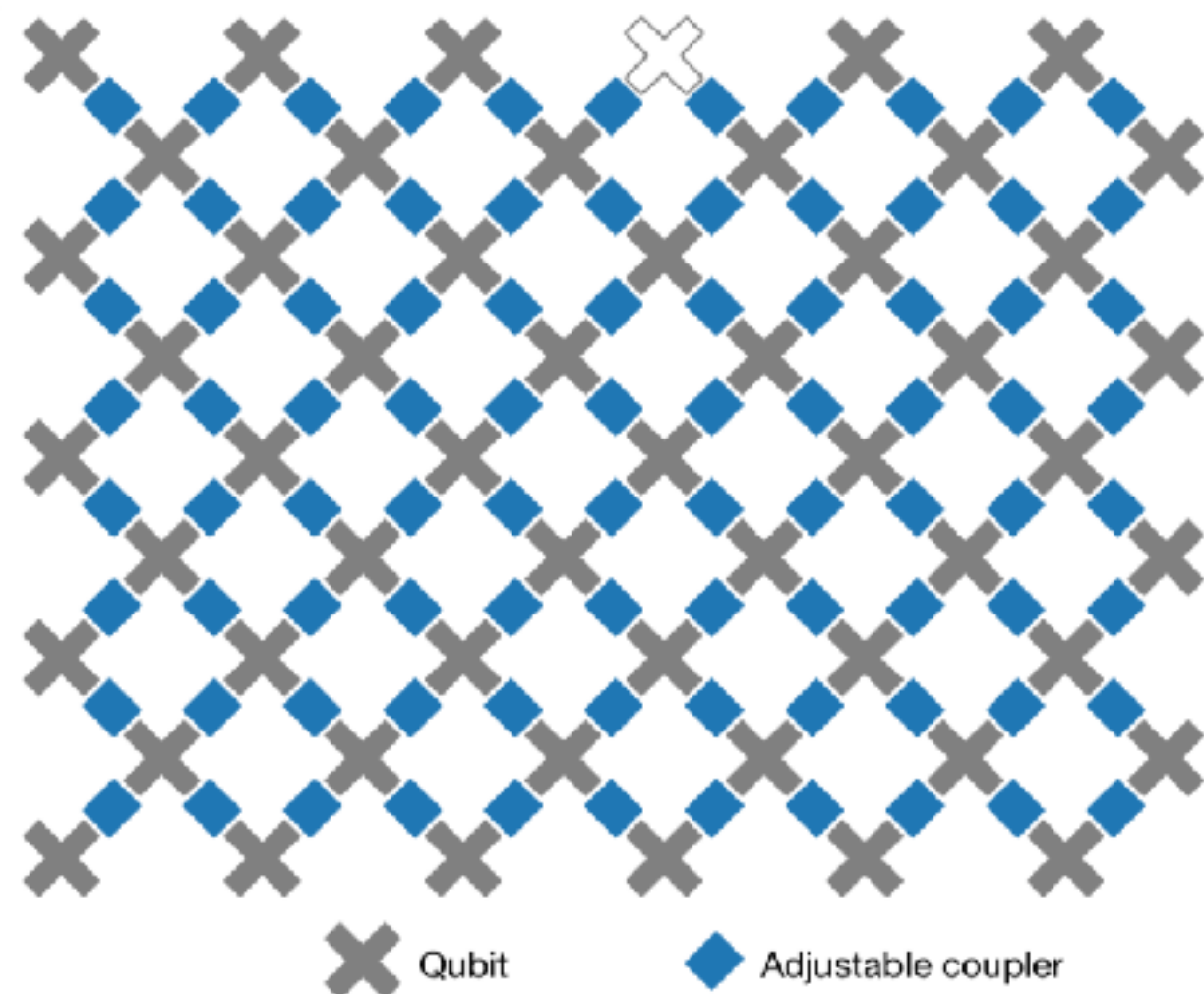
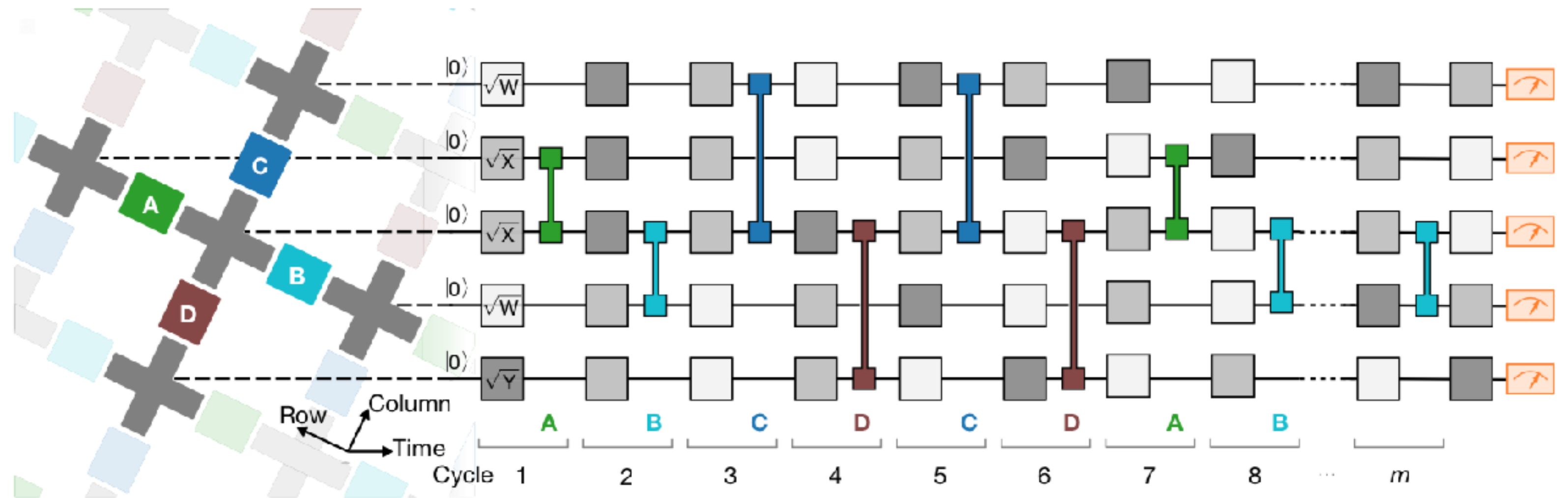
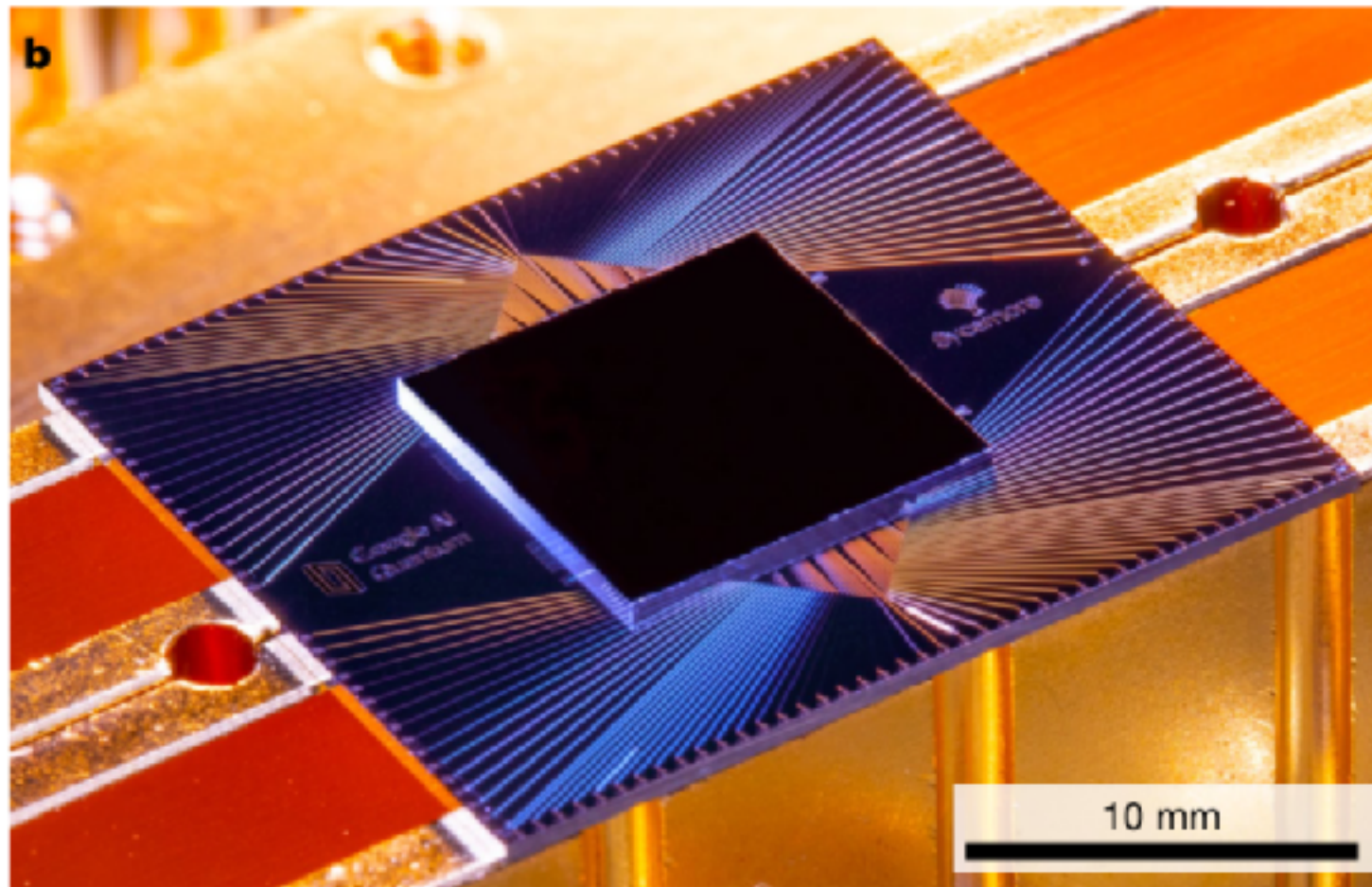
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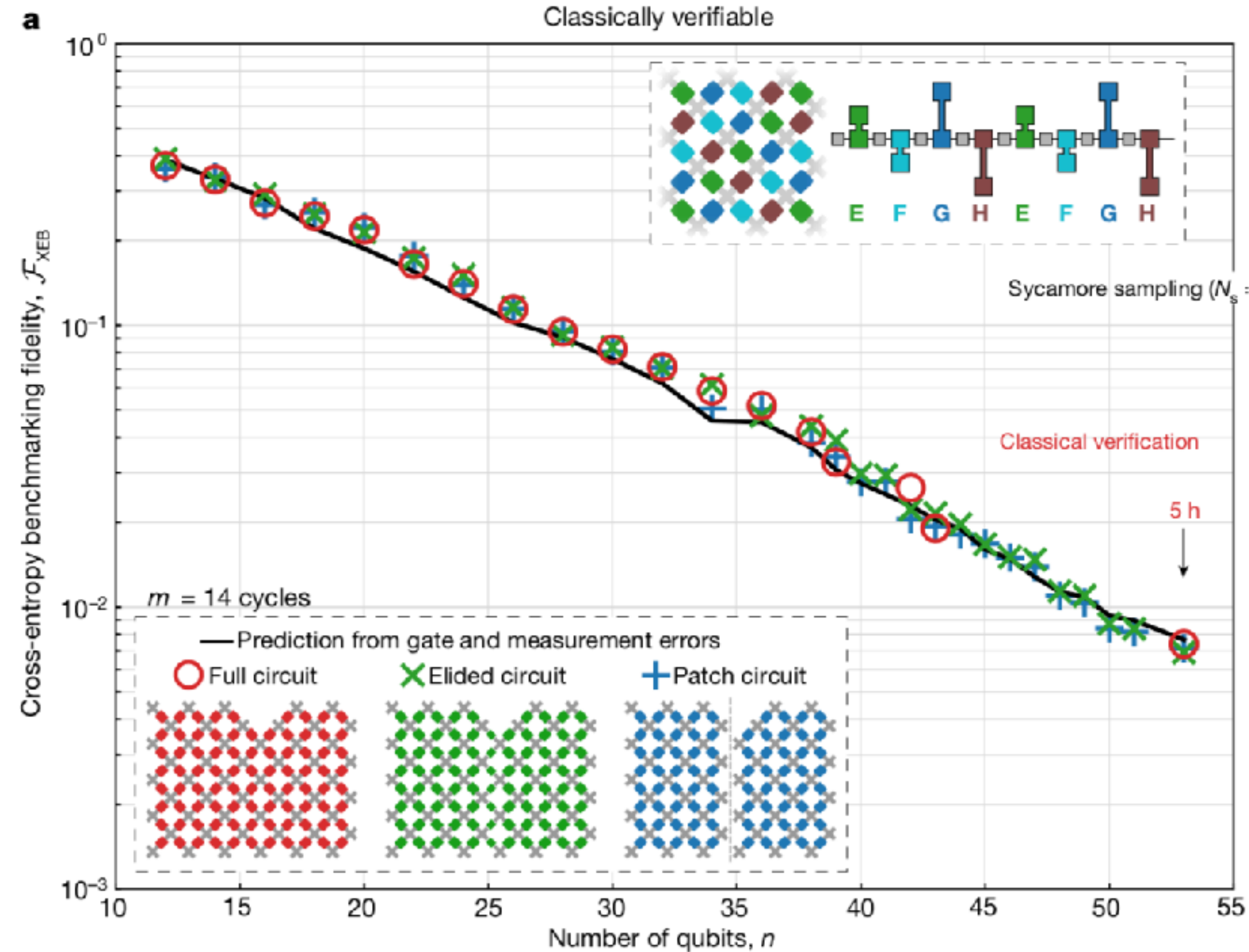


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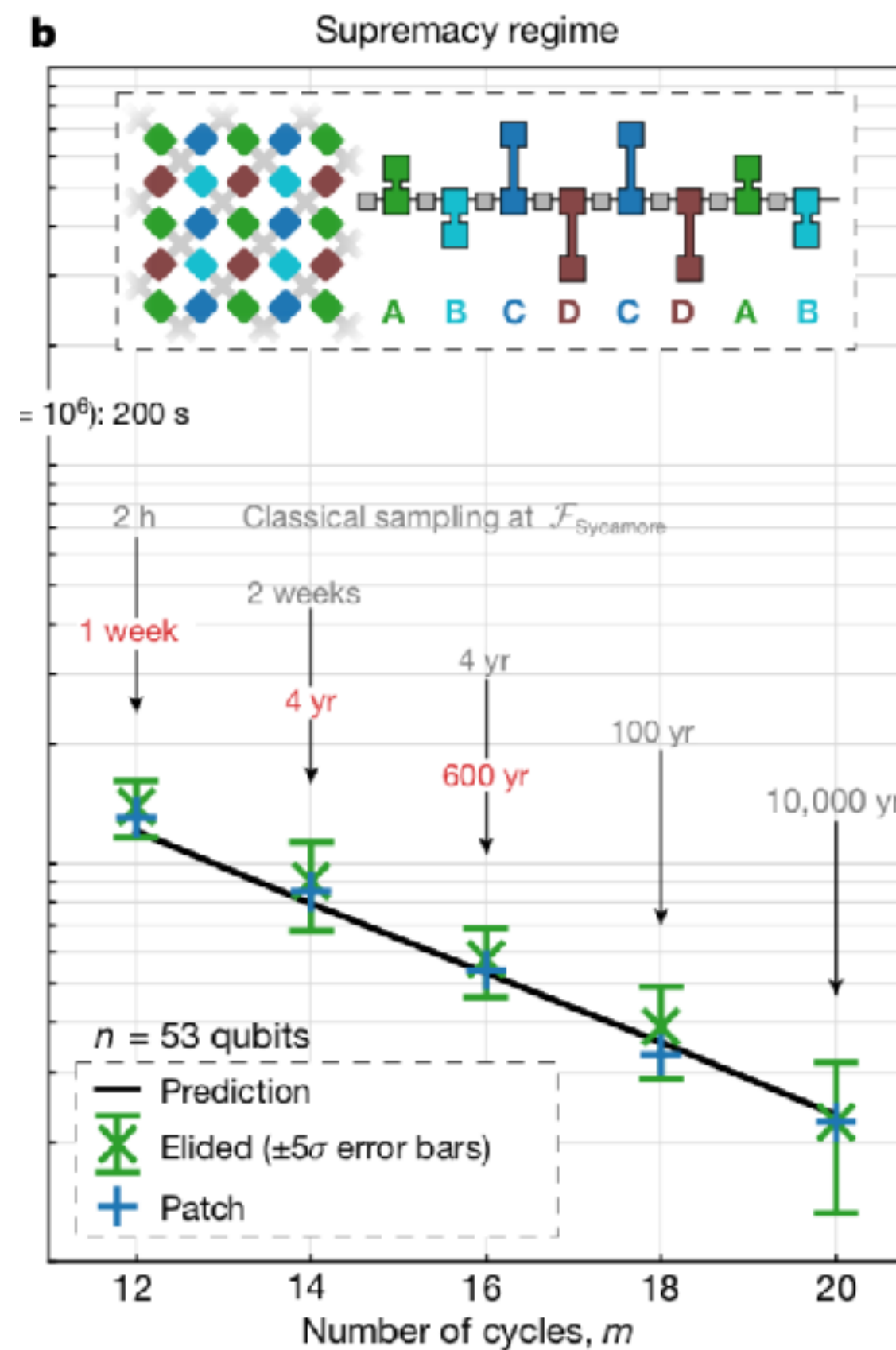


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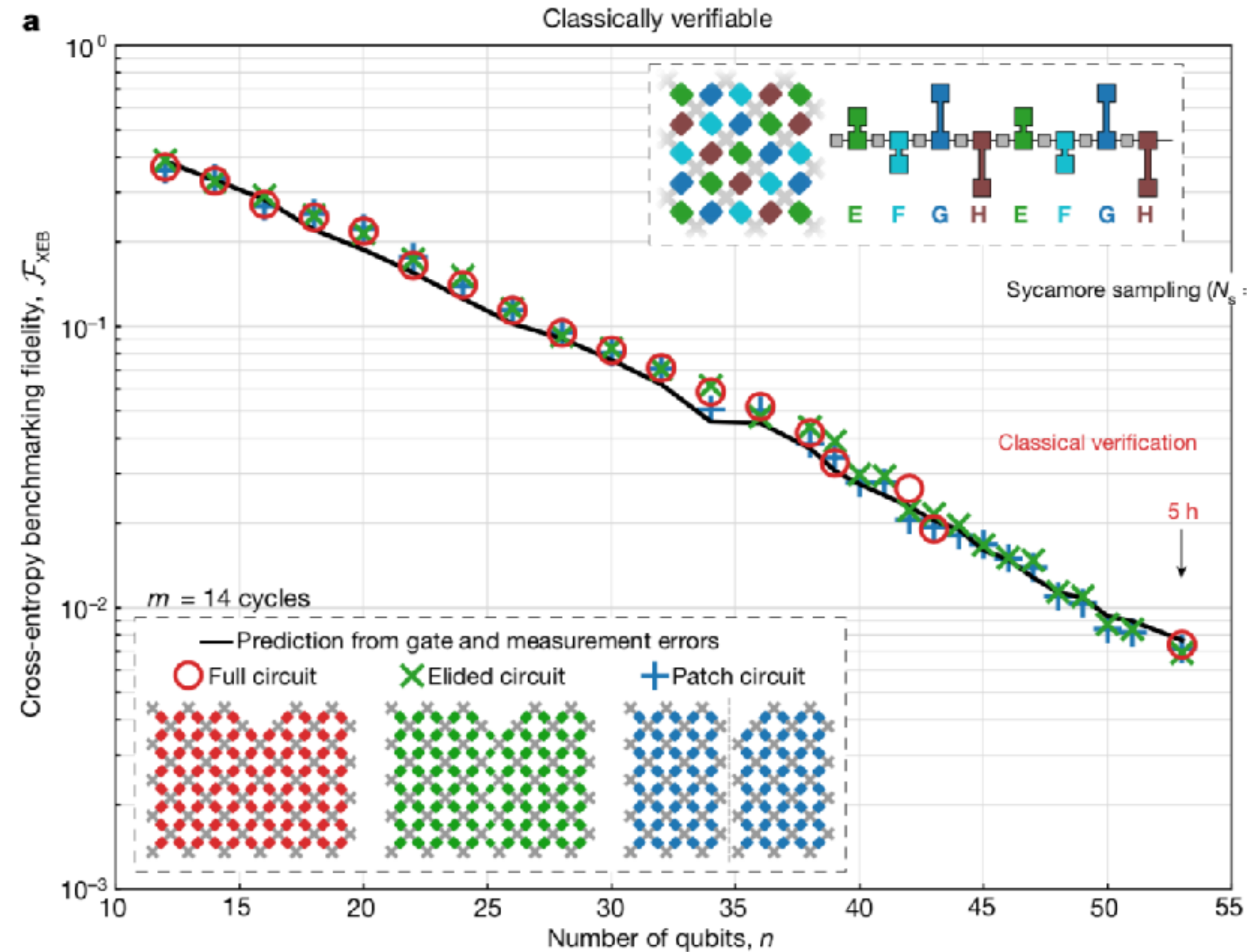


Classically verifiable

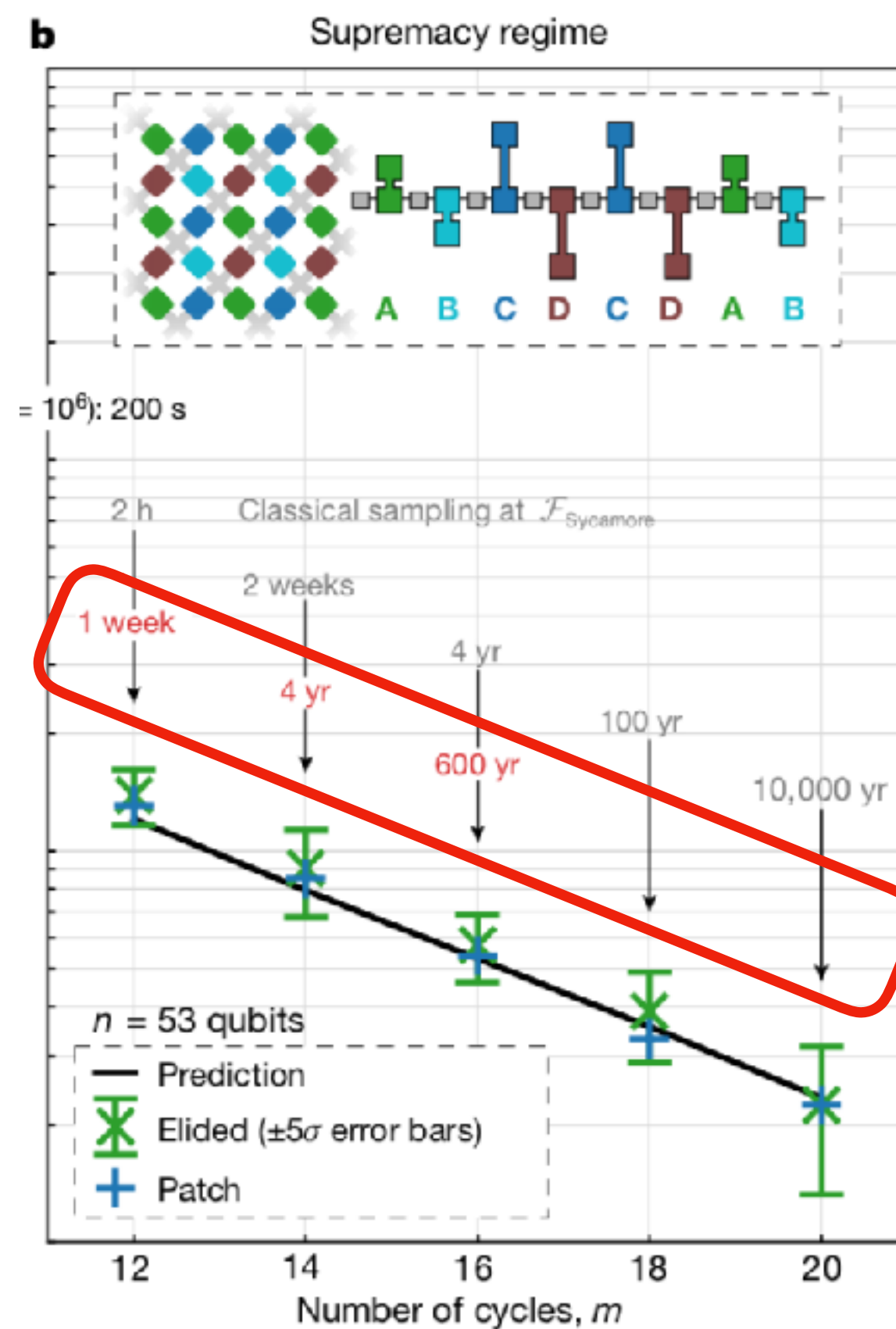


Extrapolation

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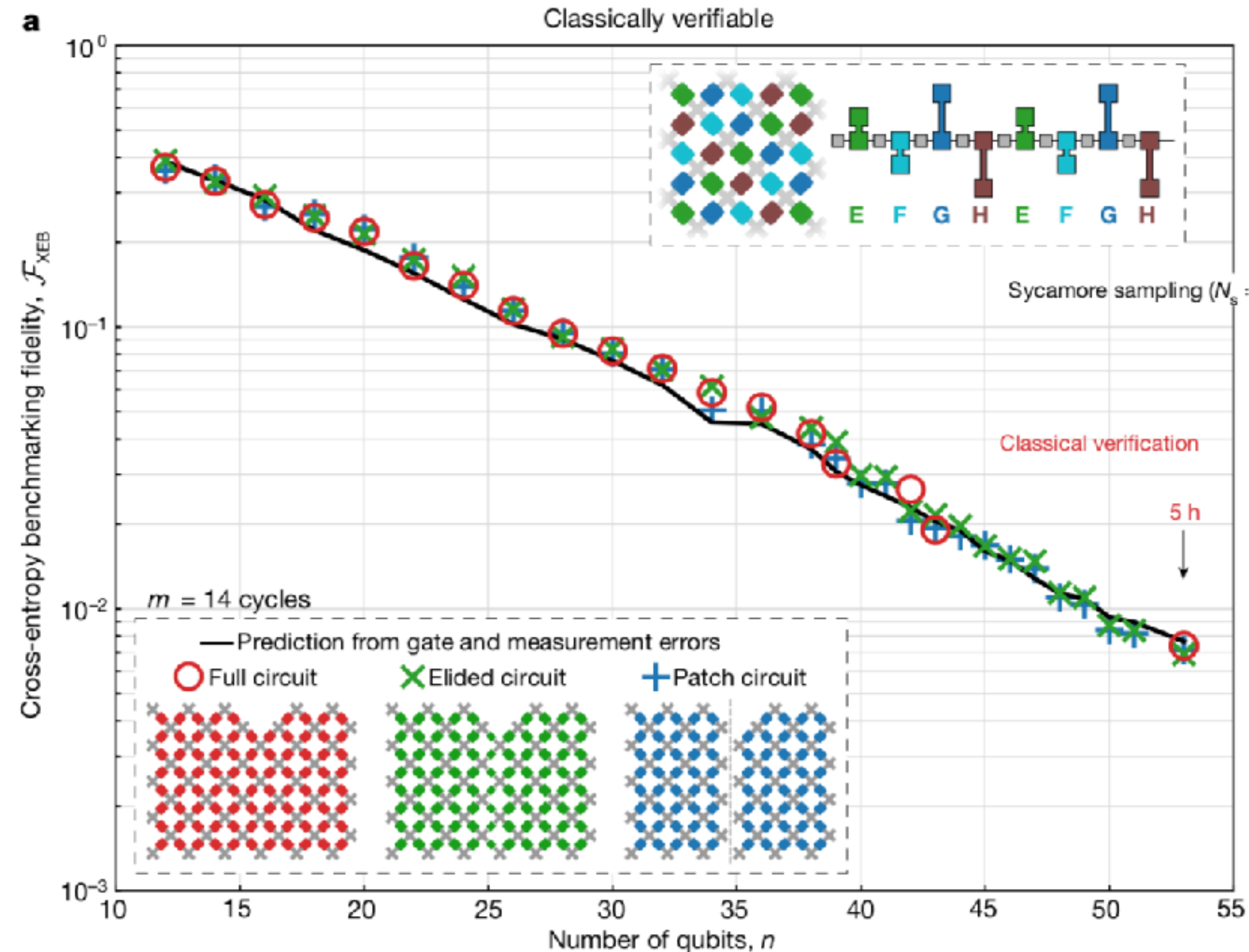


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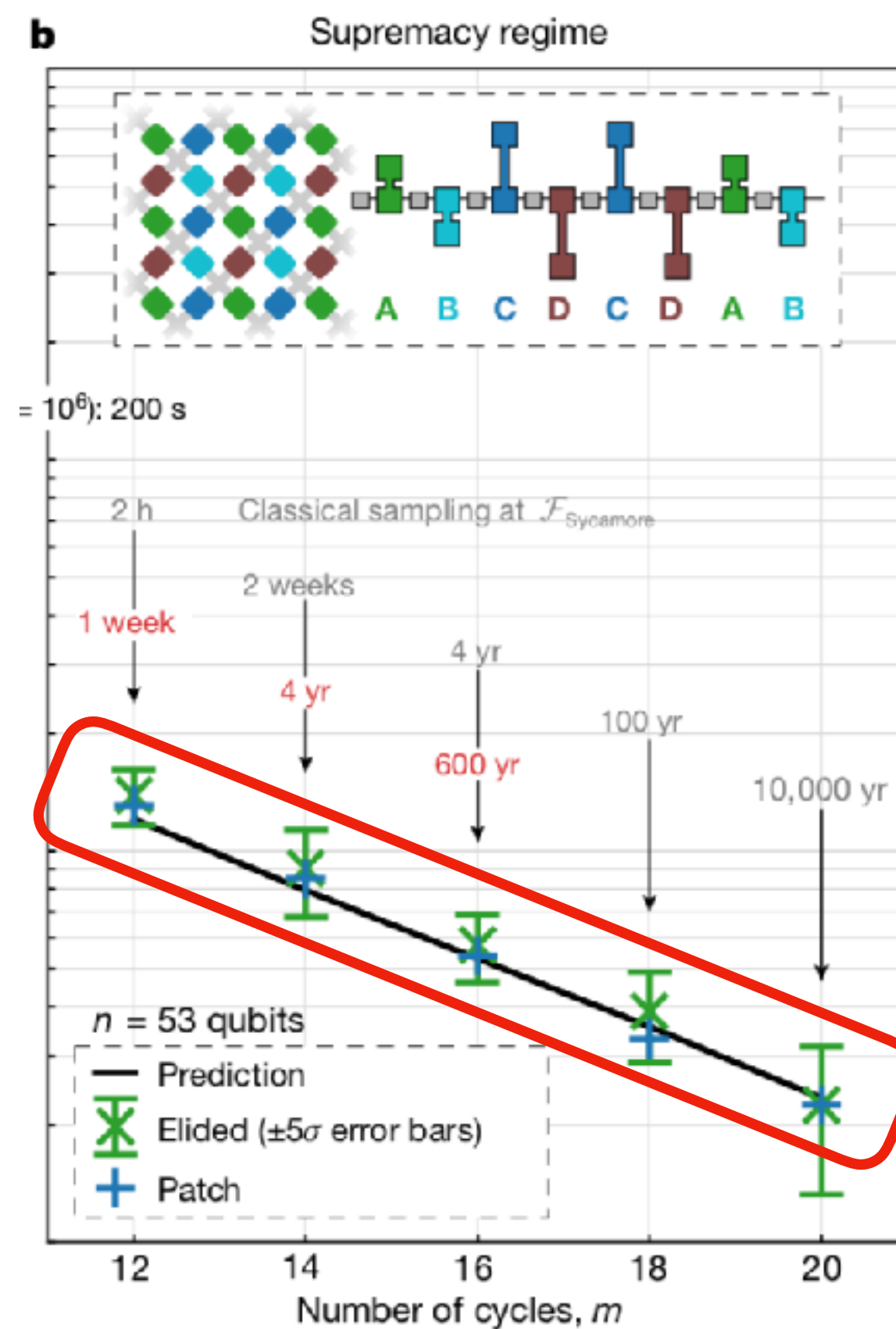
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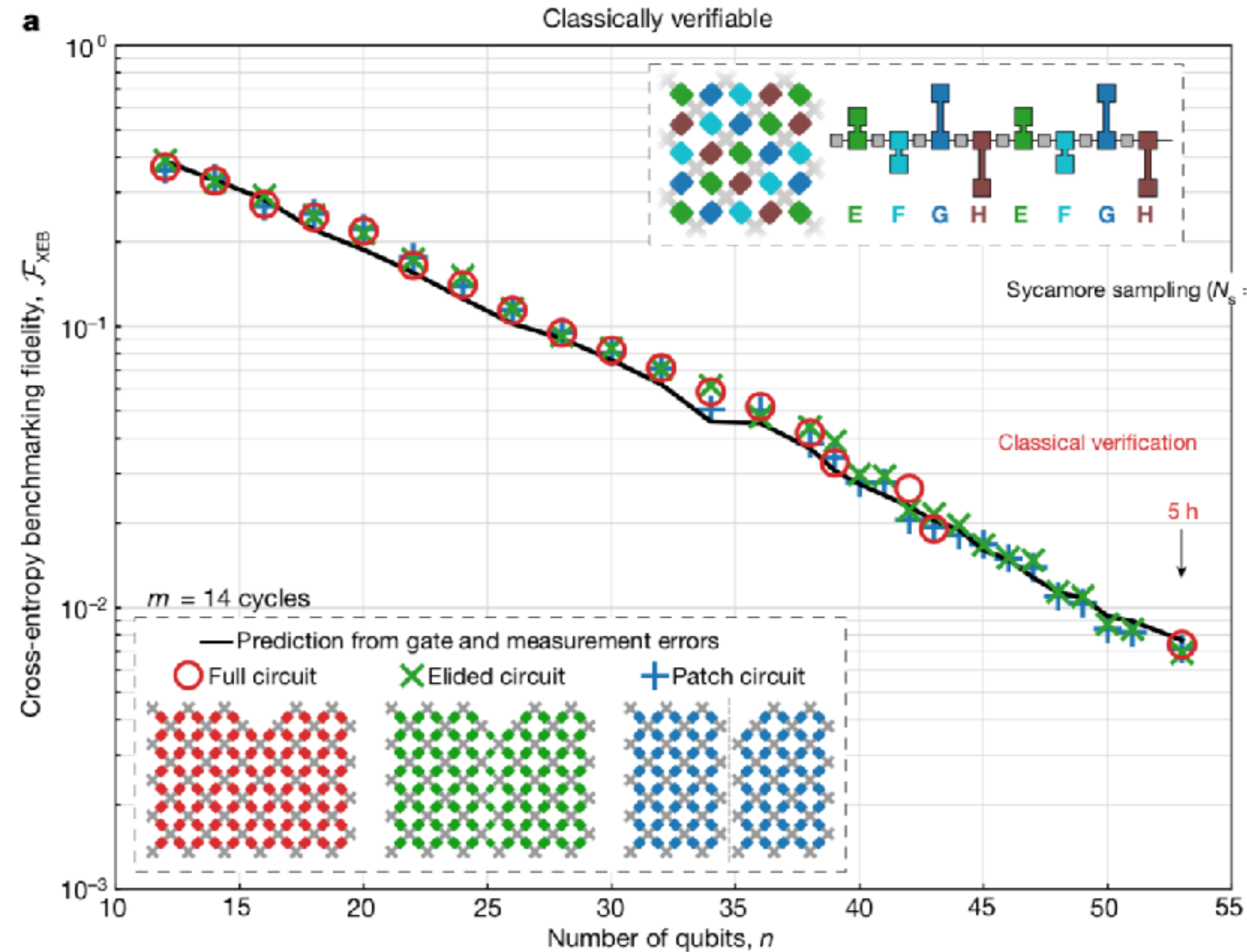
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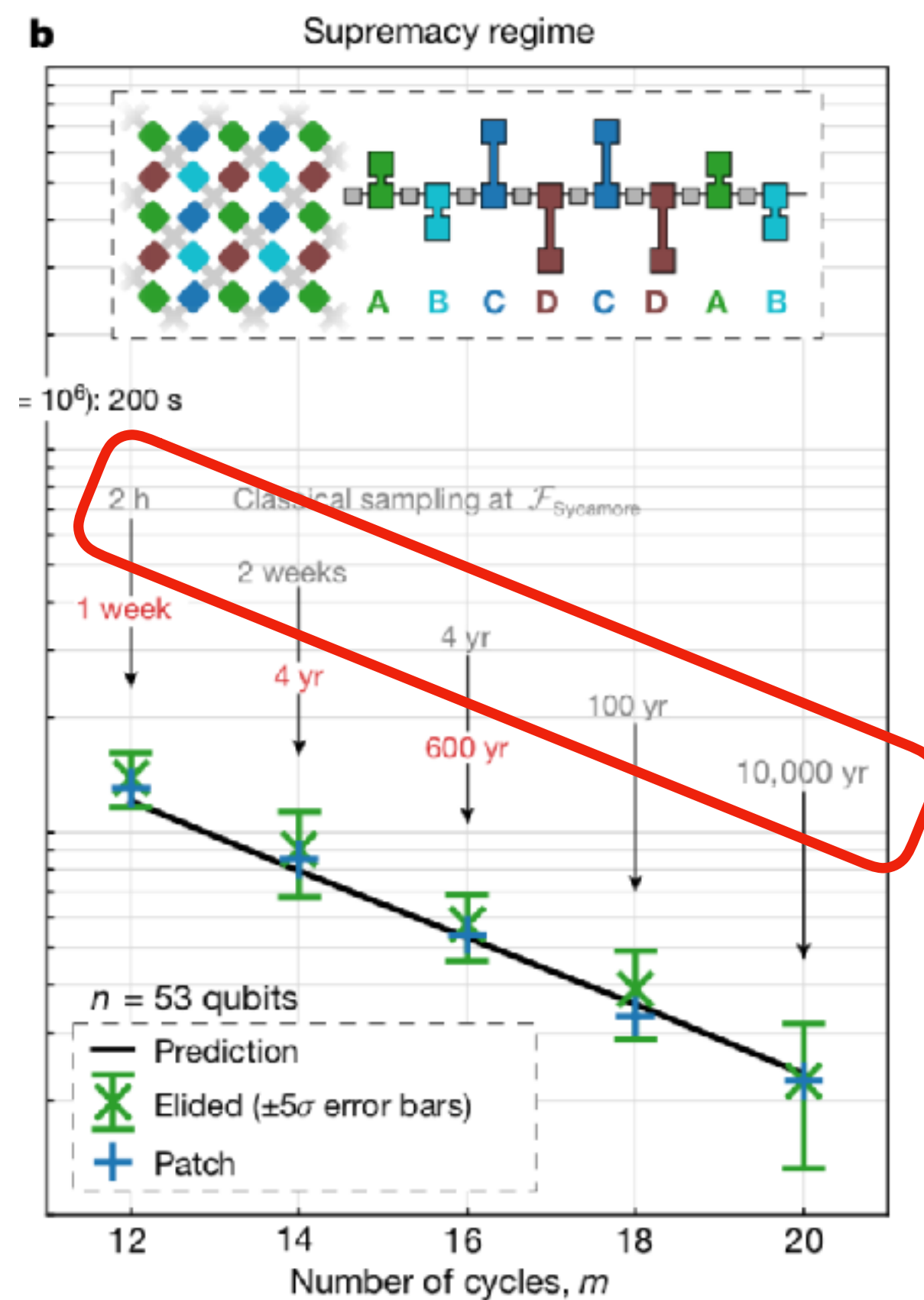
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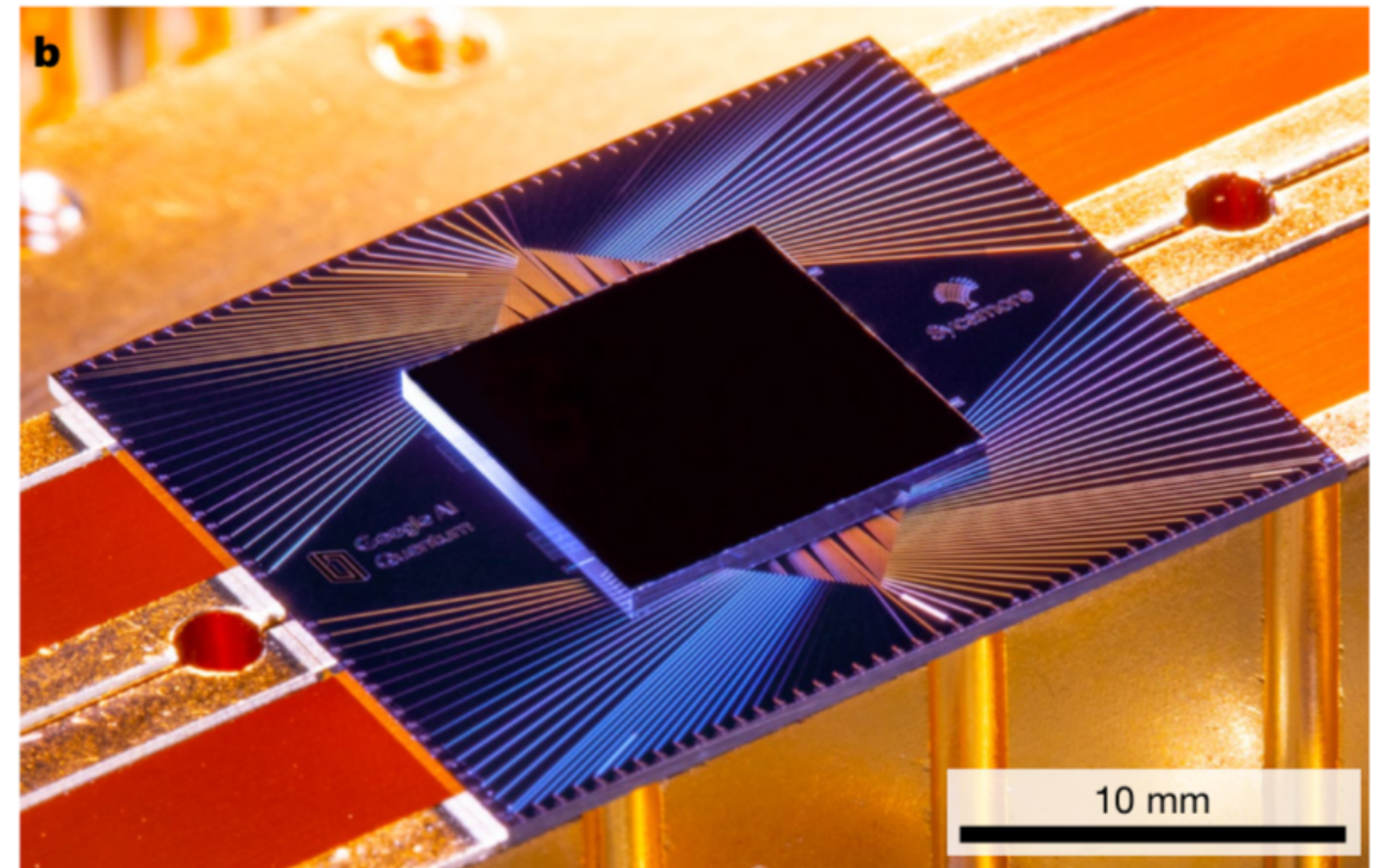
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- They conjectured classical sampling takes 10,000 years.



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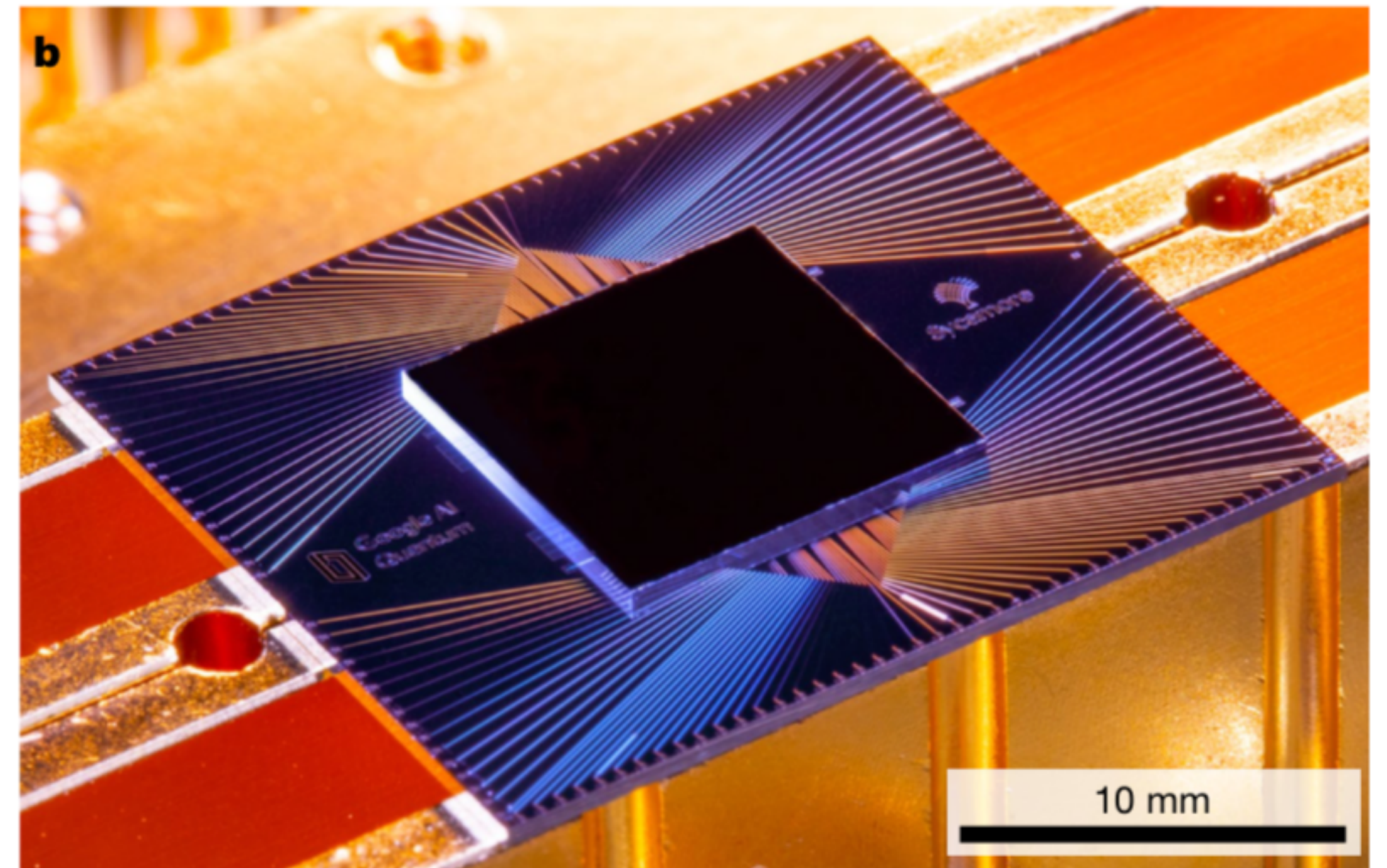




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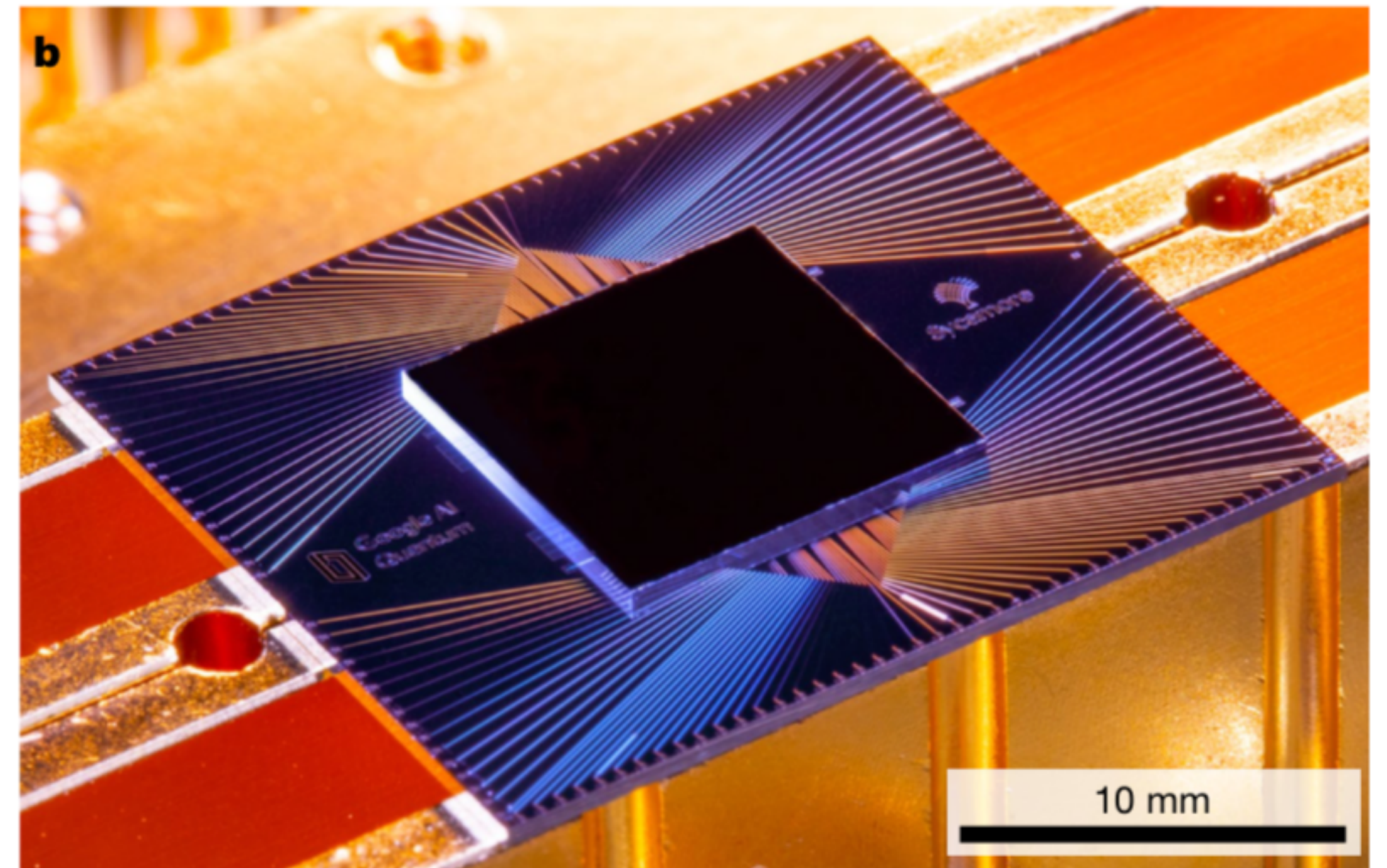




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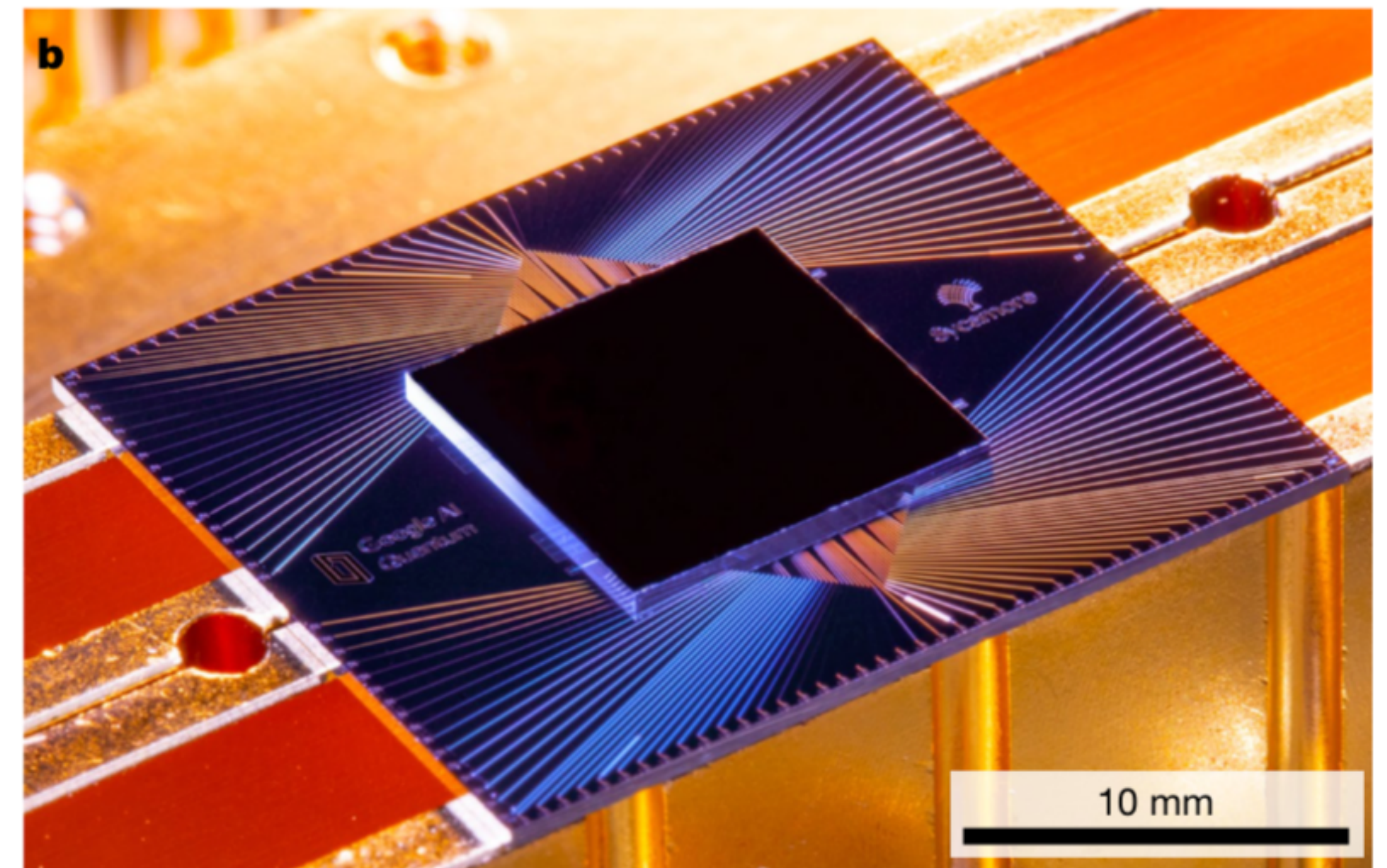




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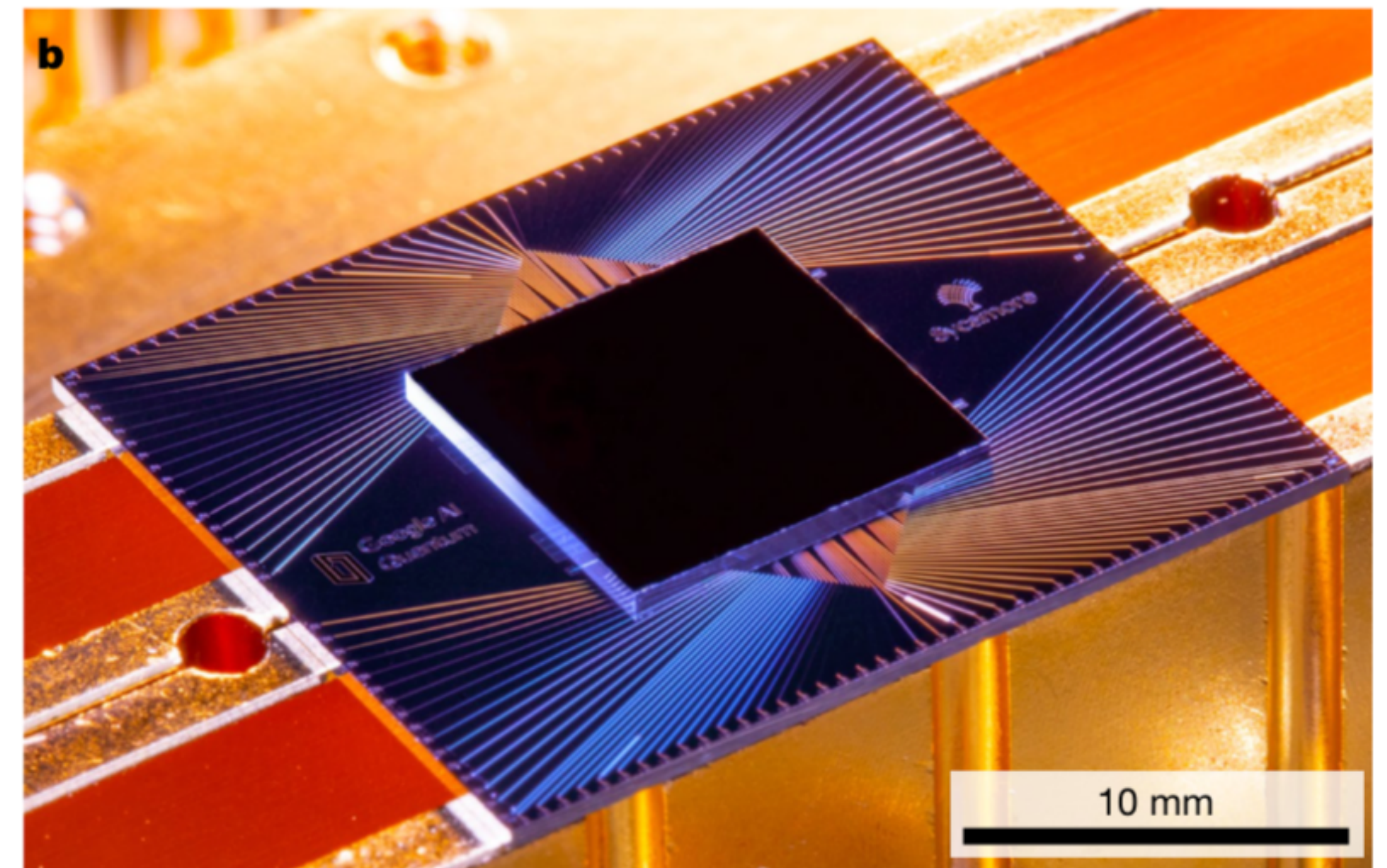




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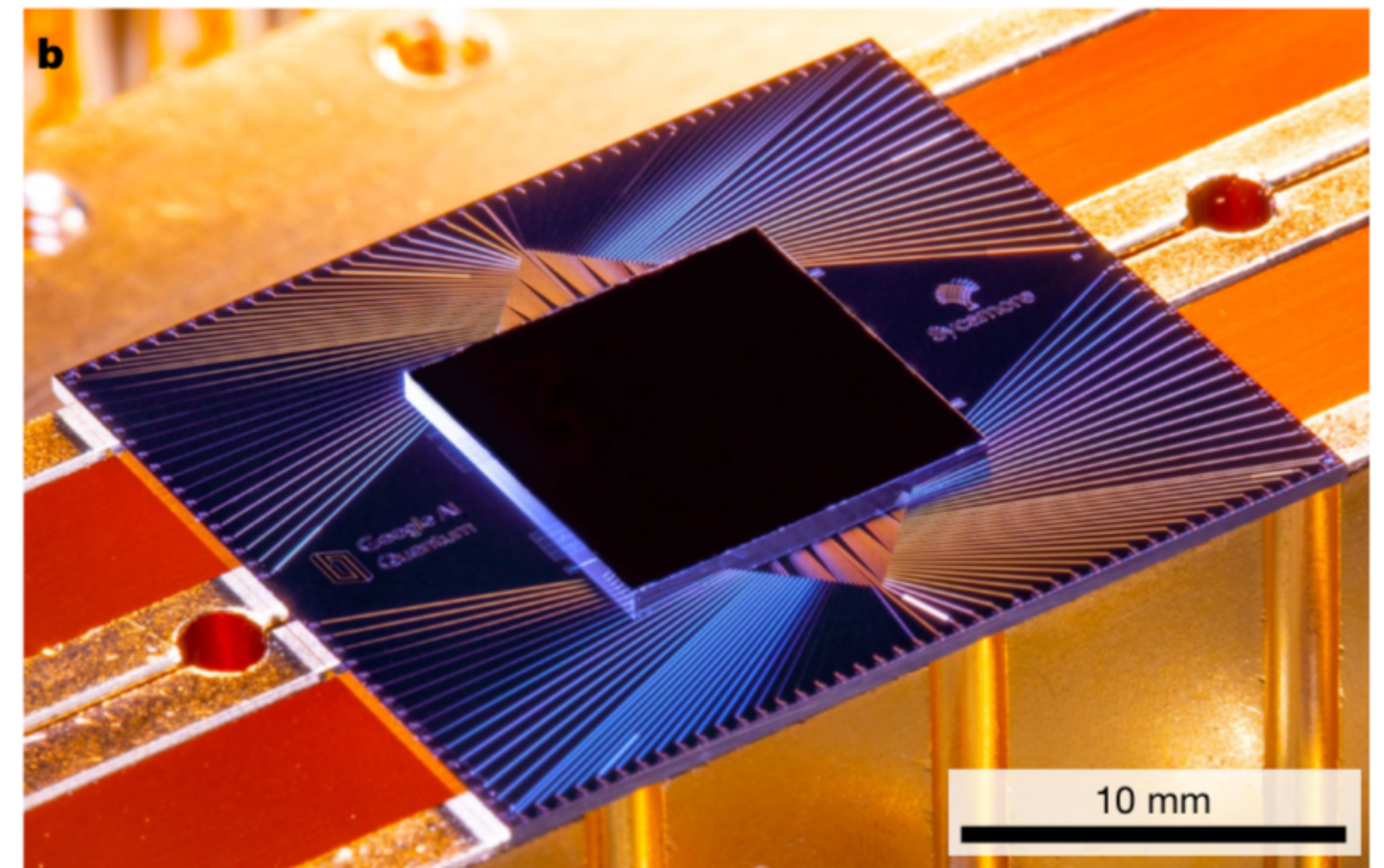




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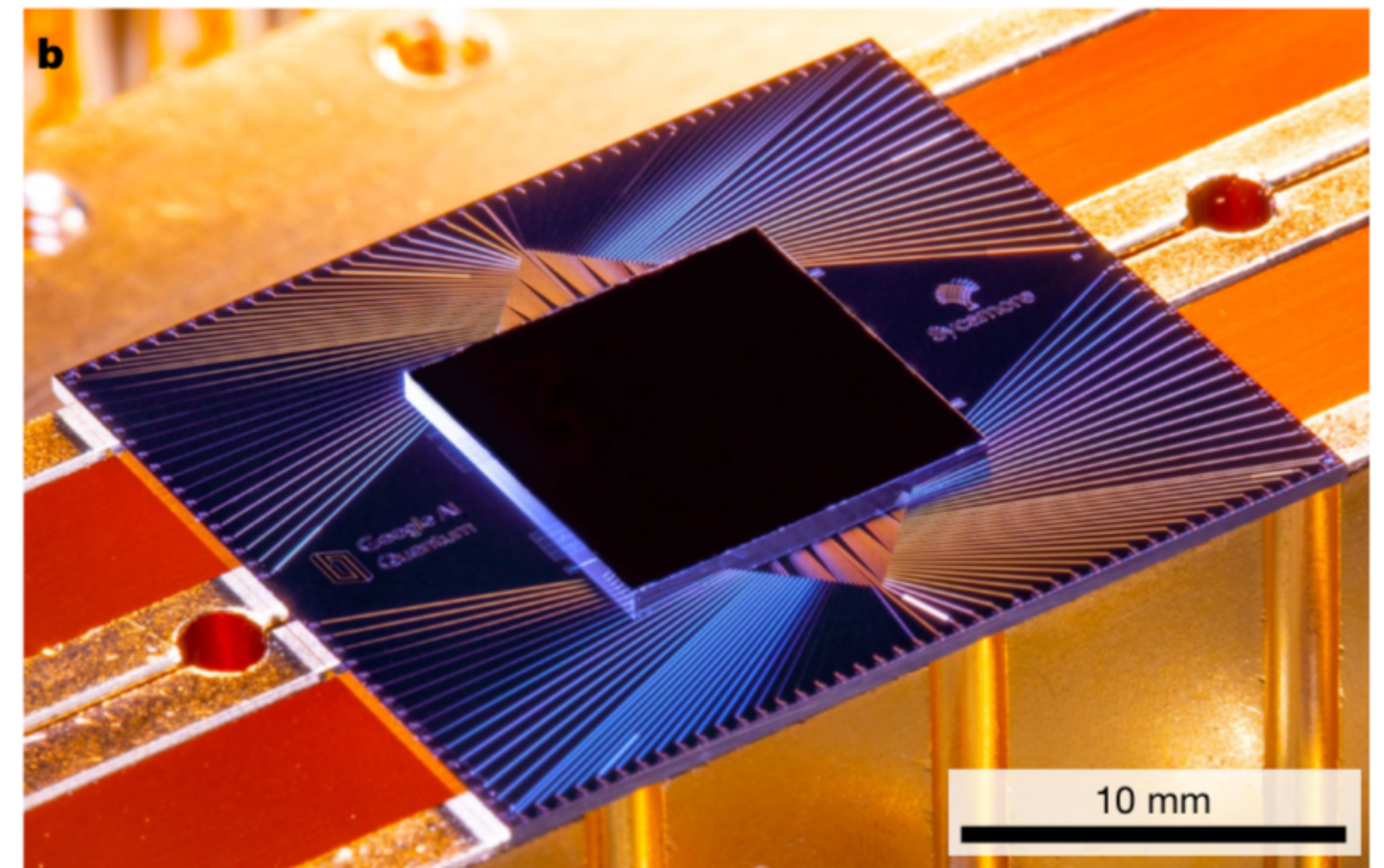




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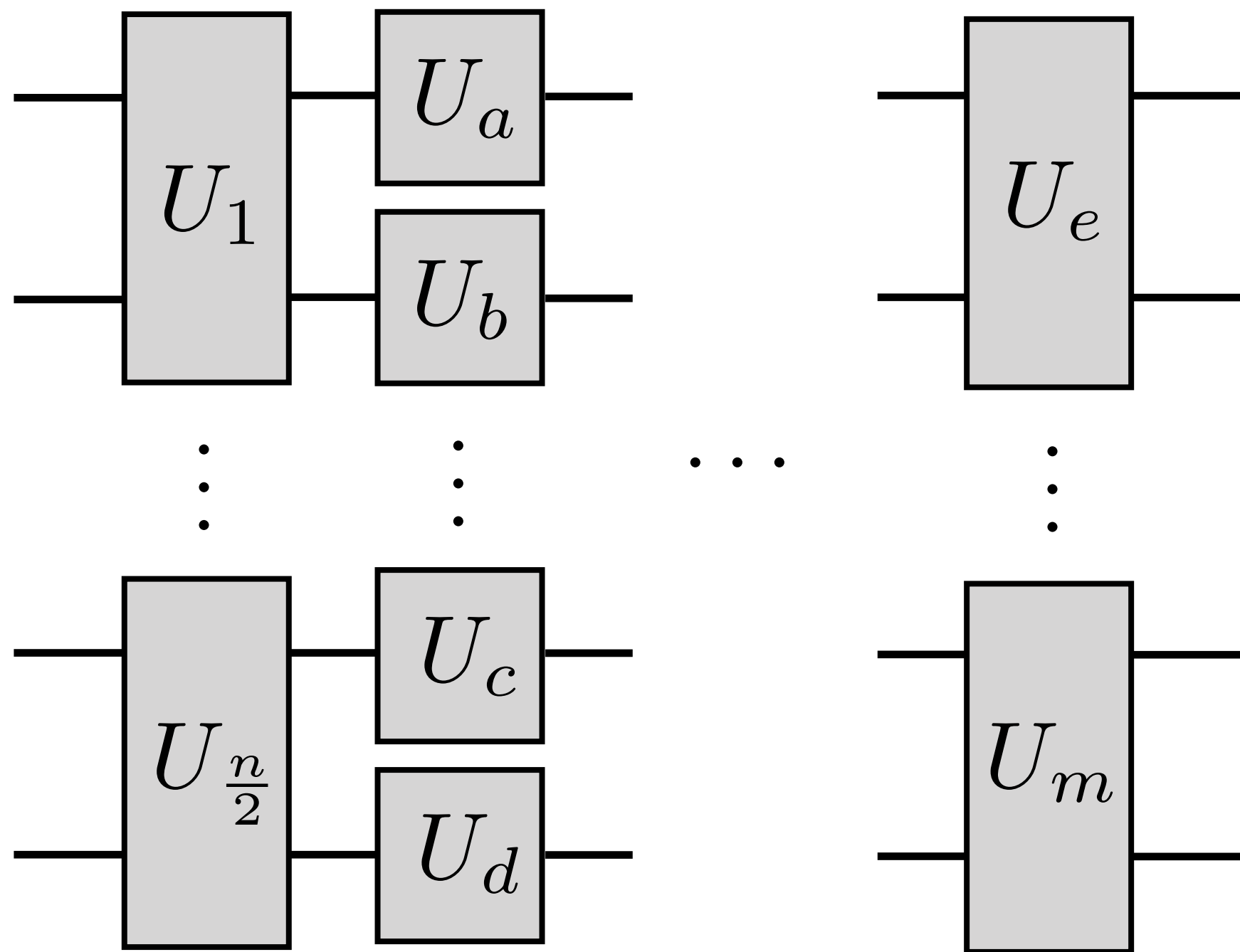
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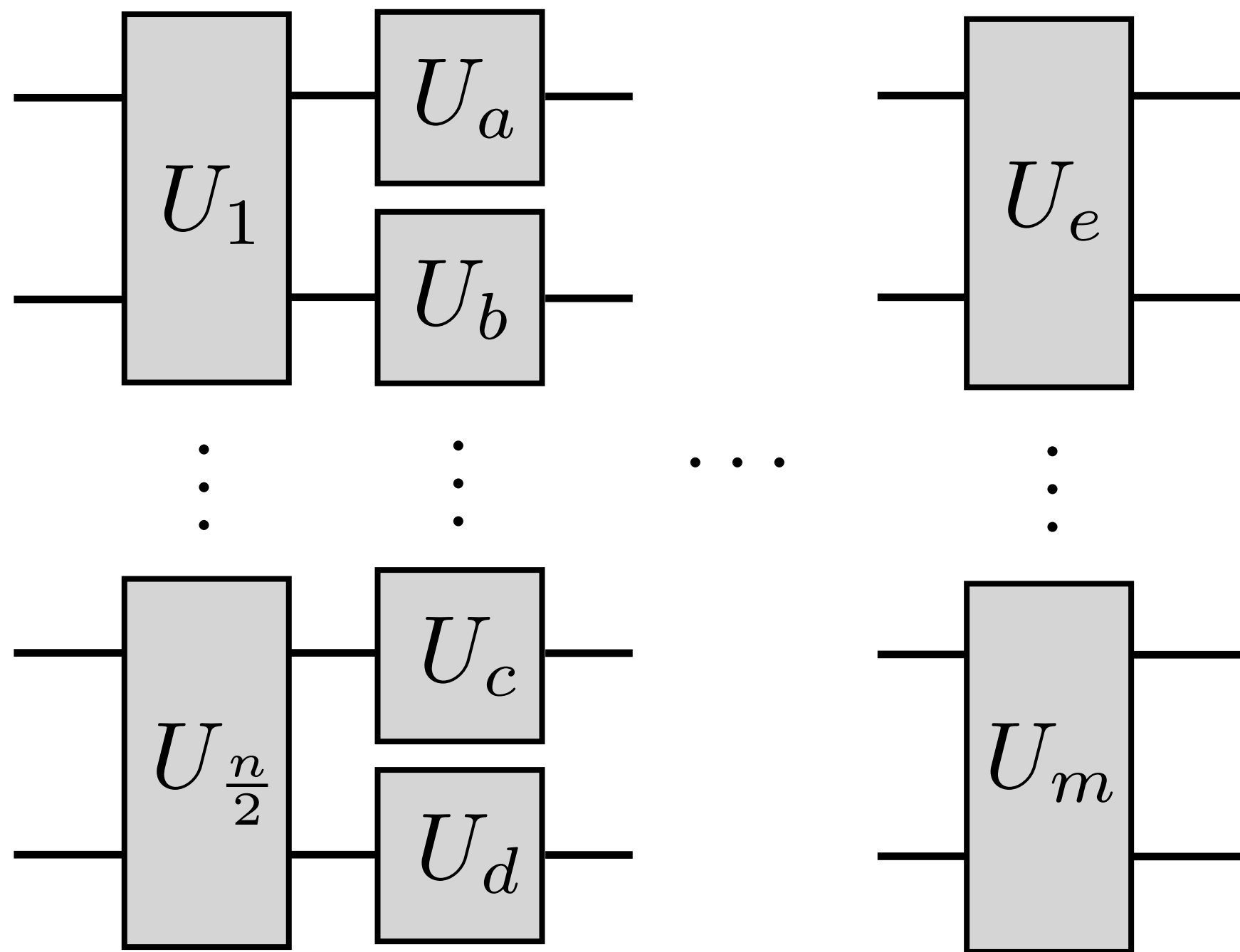
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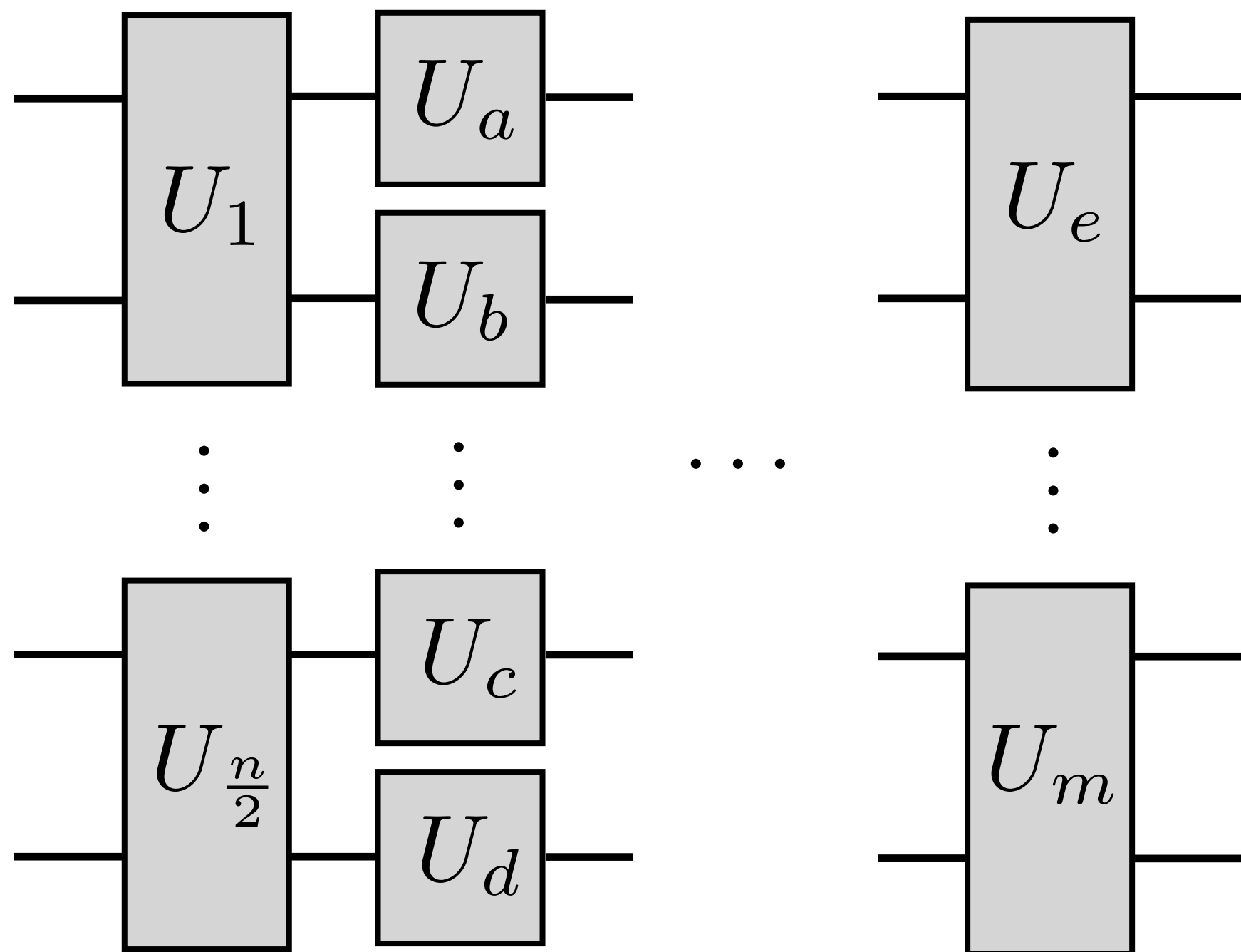
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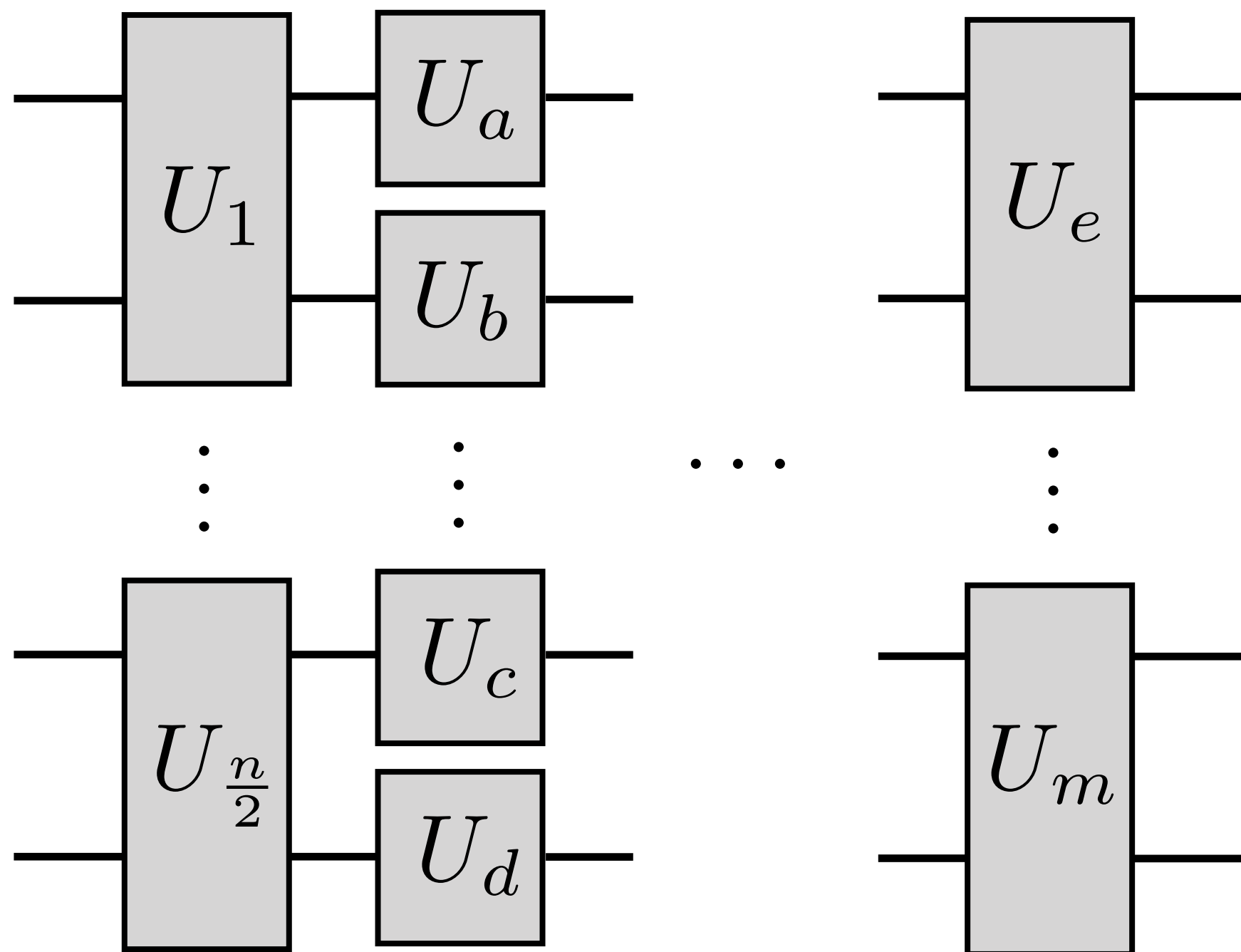


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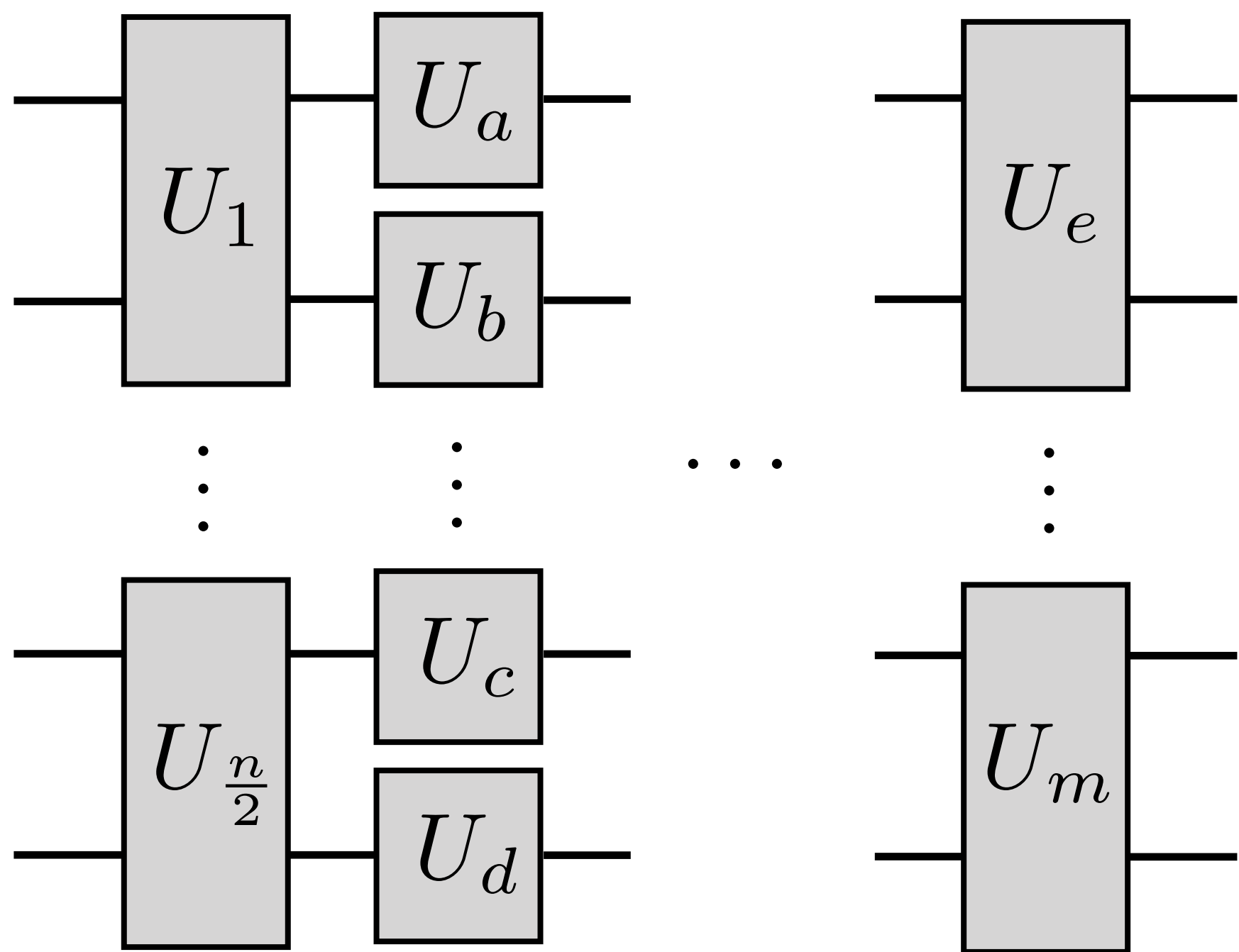
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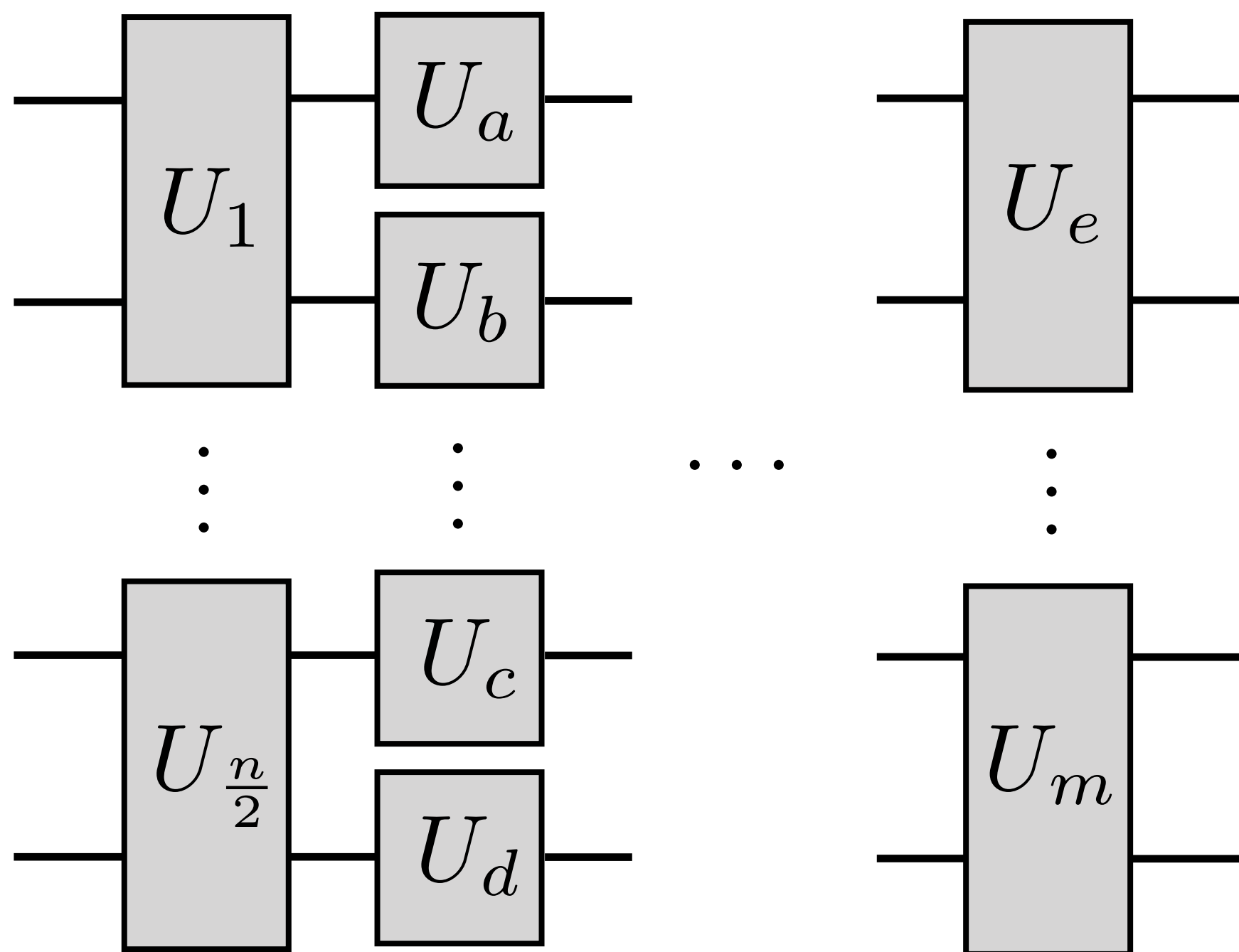
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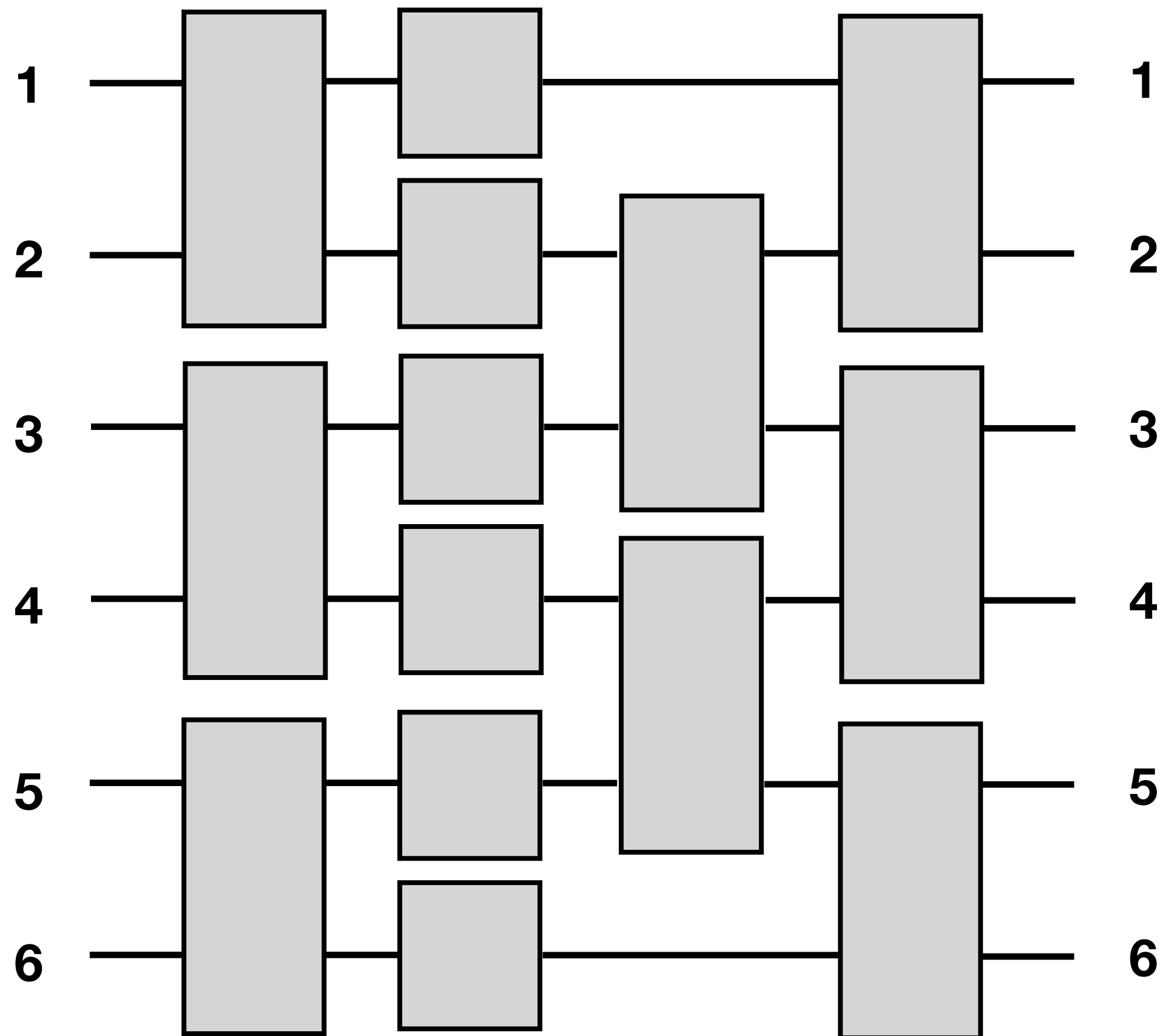
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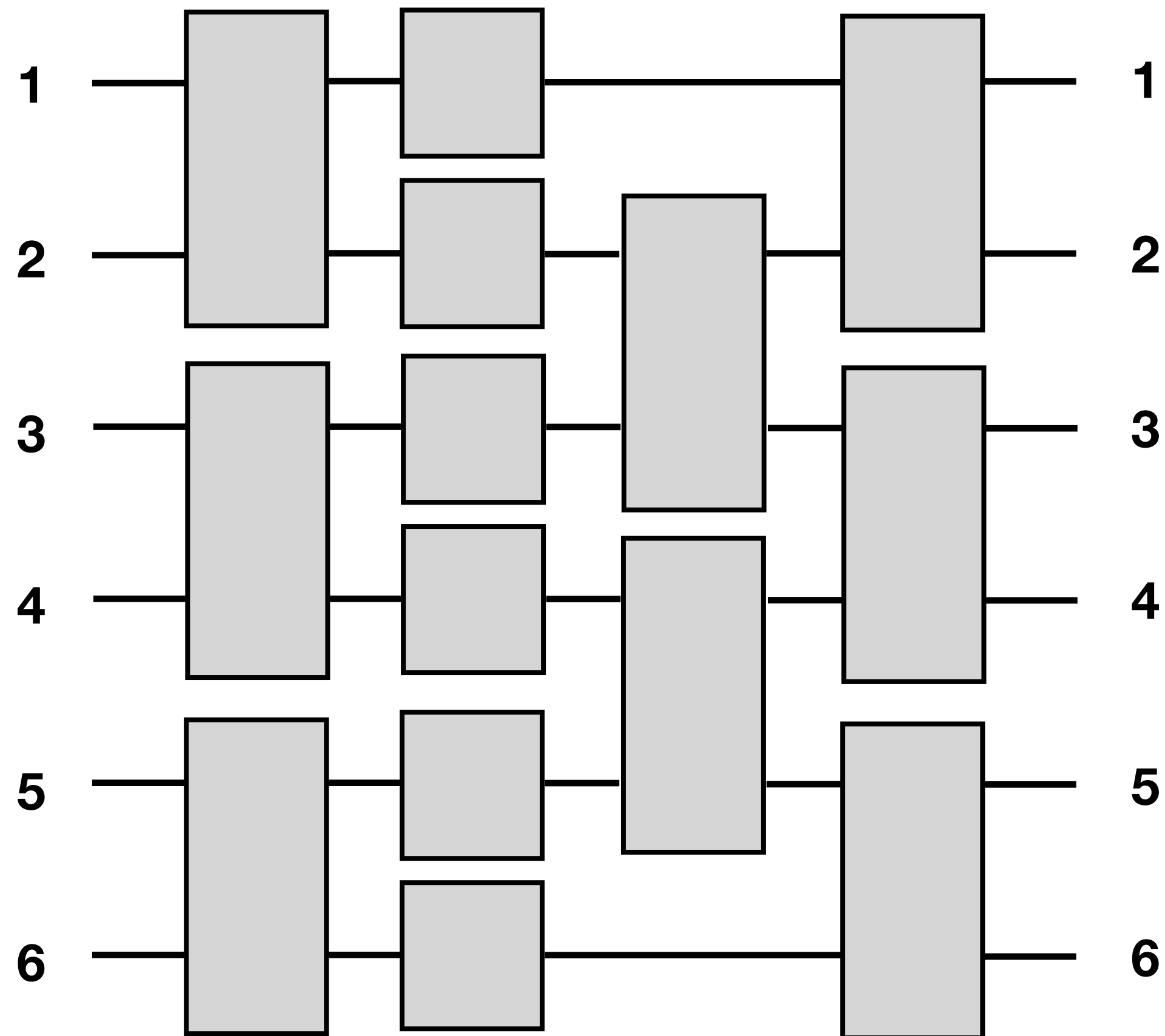
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# Spoofing Linear XEB in Shallow Circuits



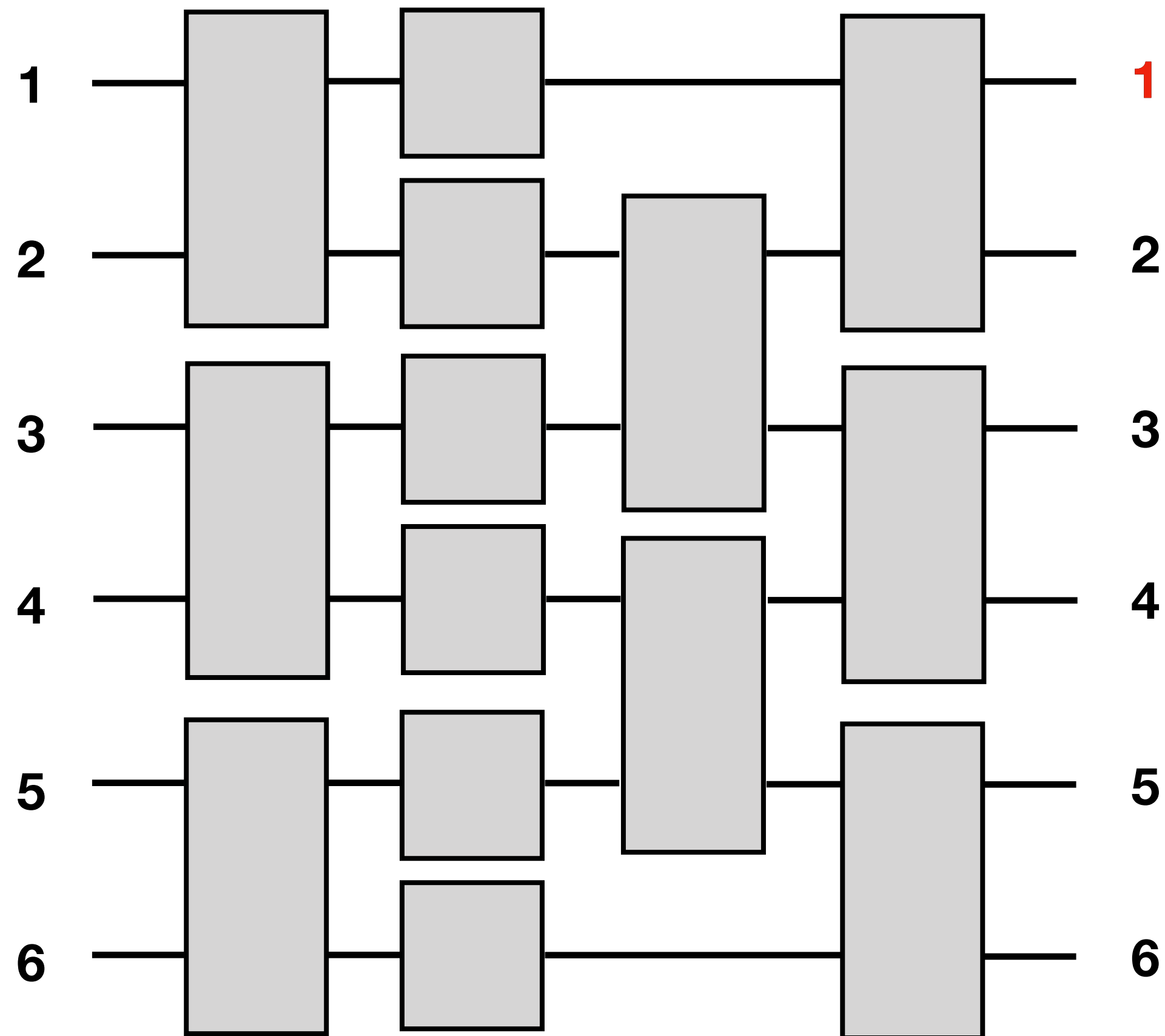
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**Observation:** The marginal of an output qubit only depends on its *lightcone*!



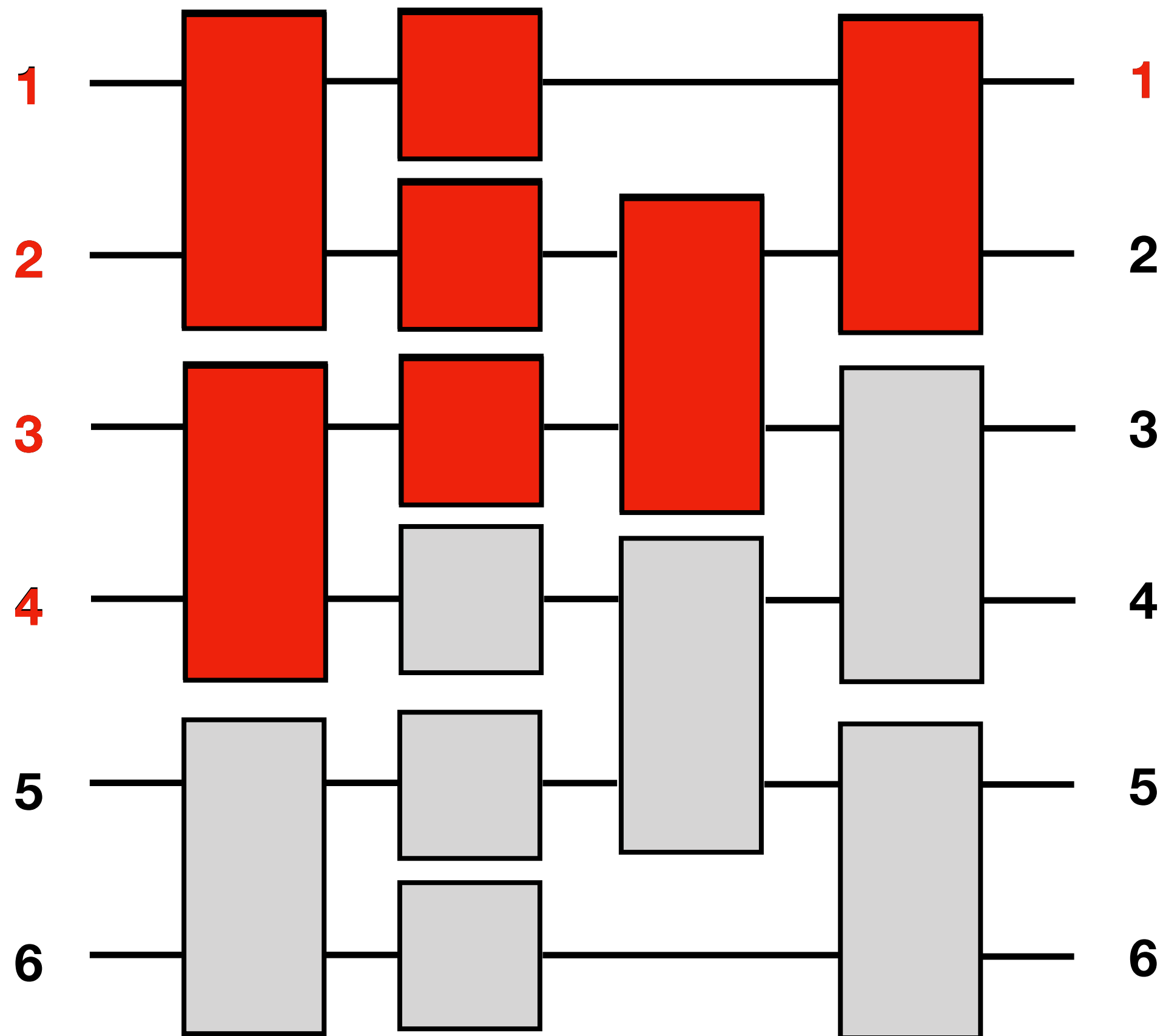
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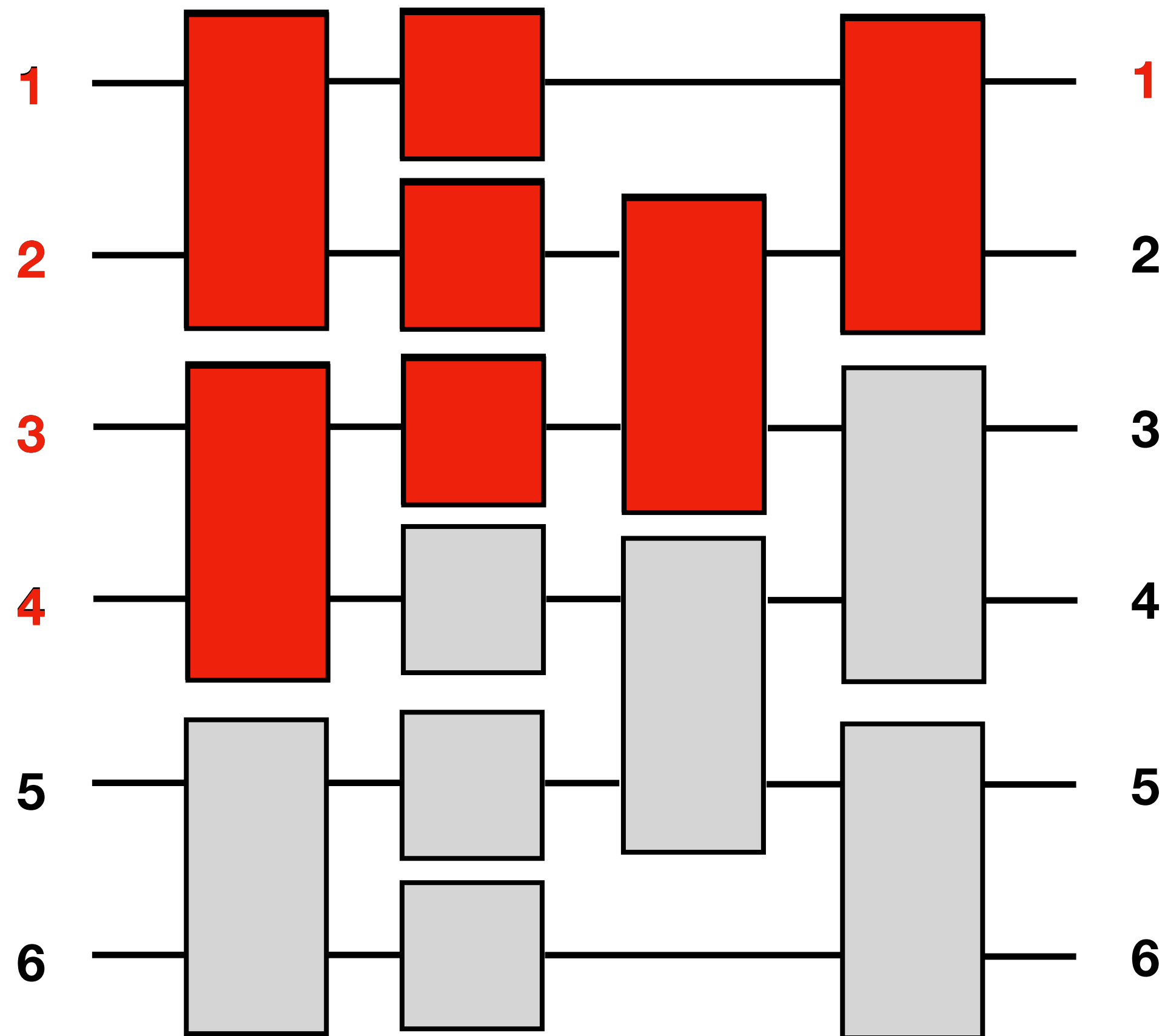
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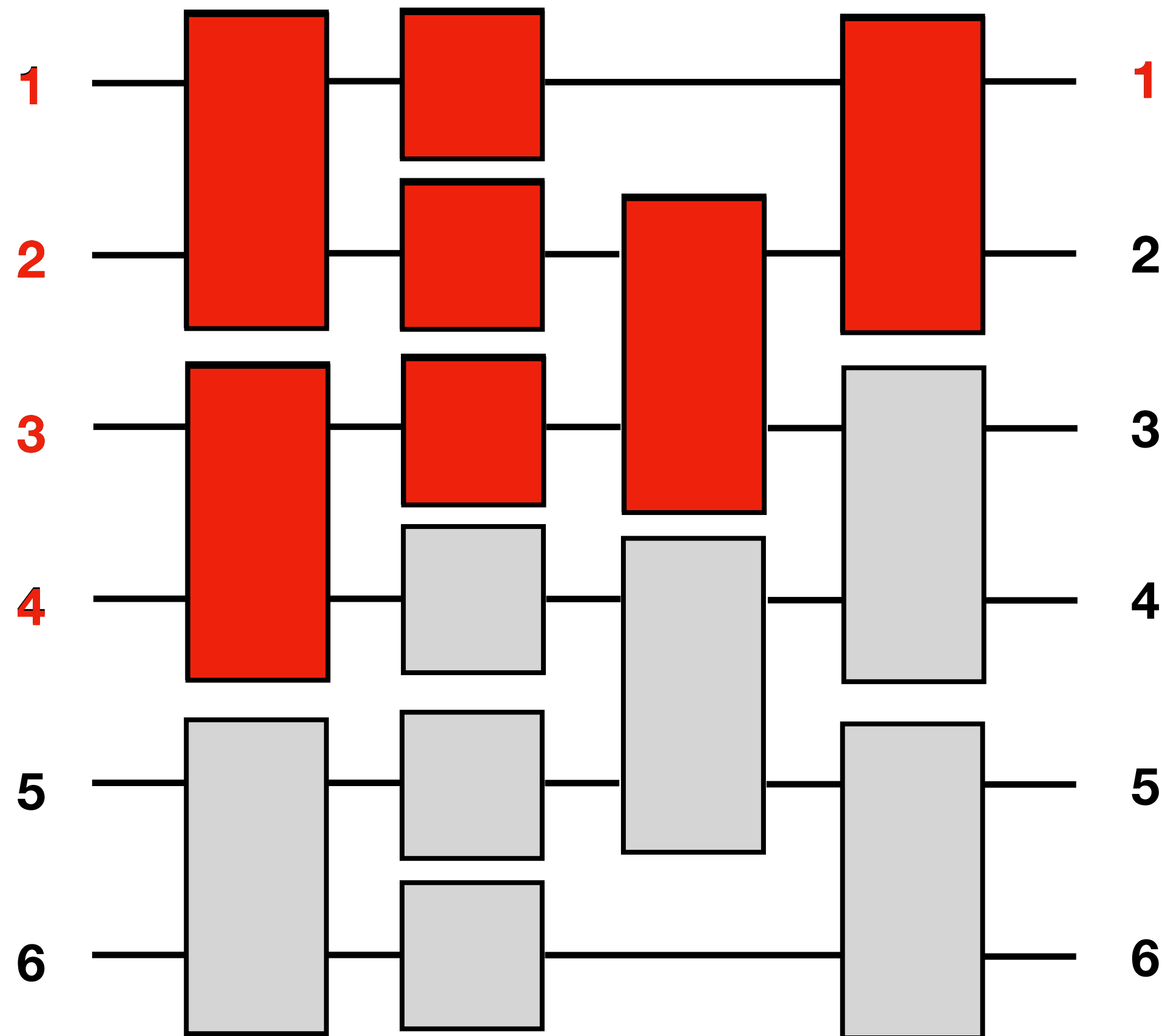
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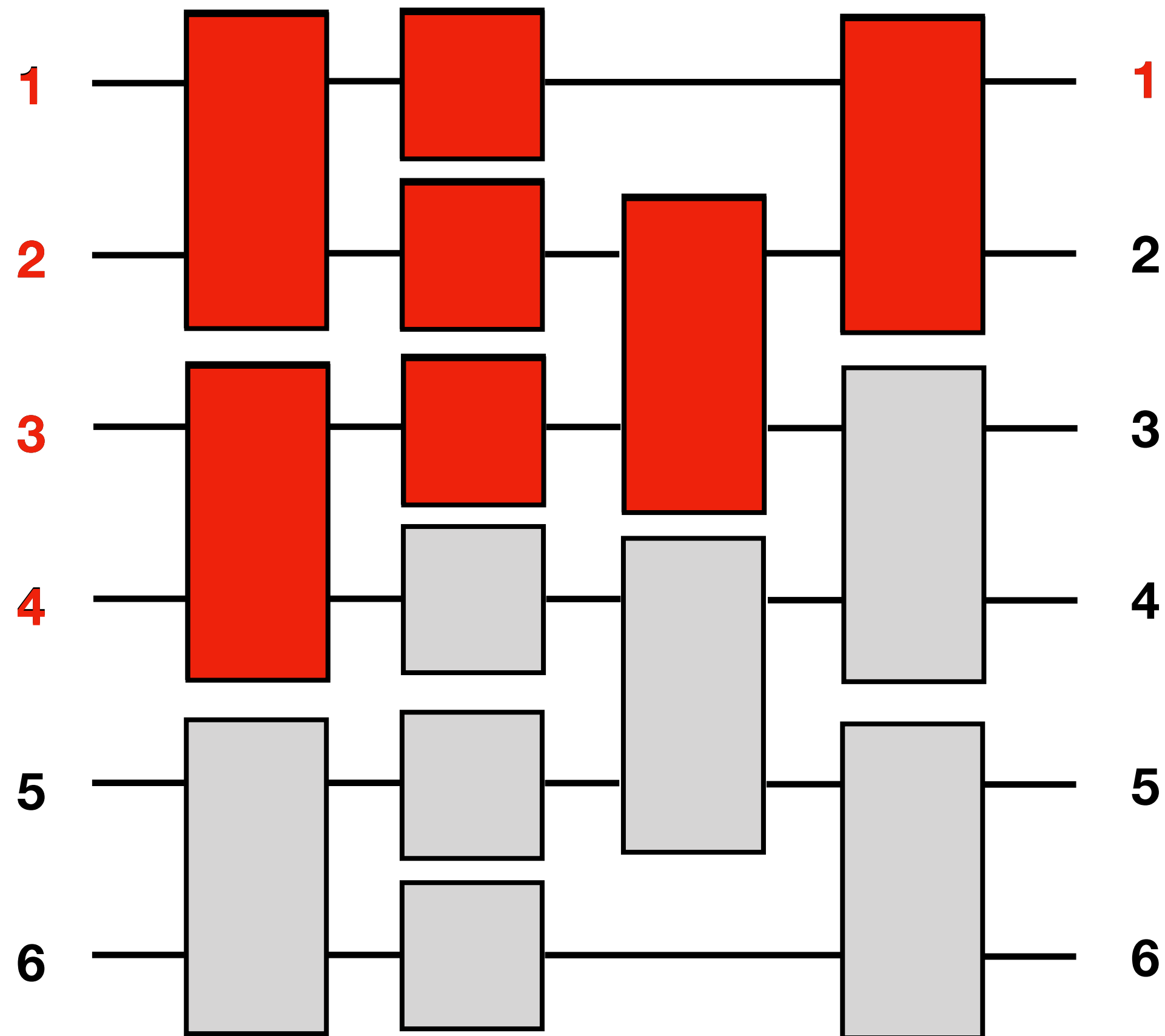


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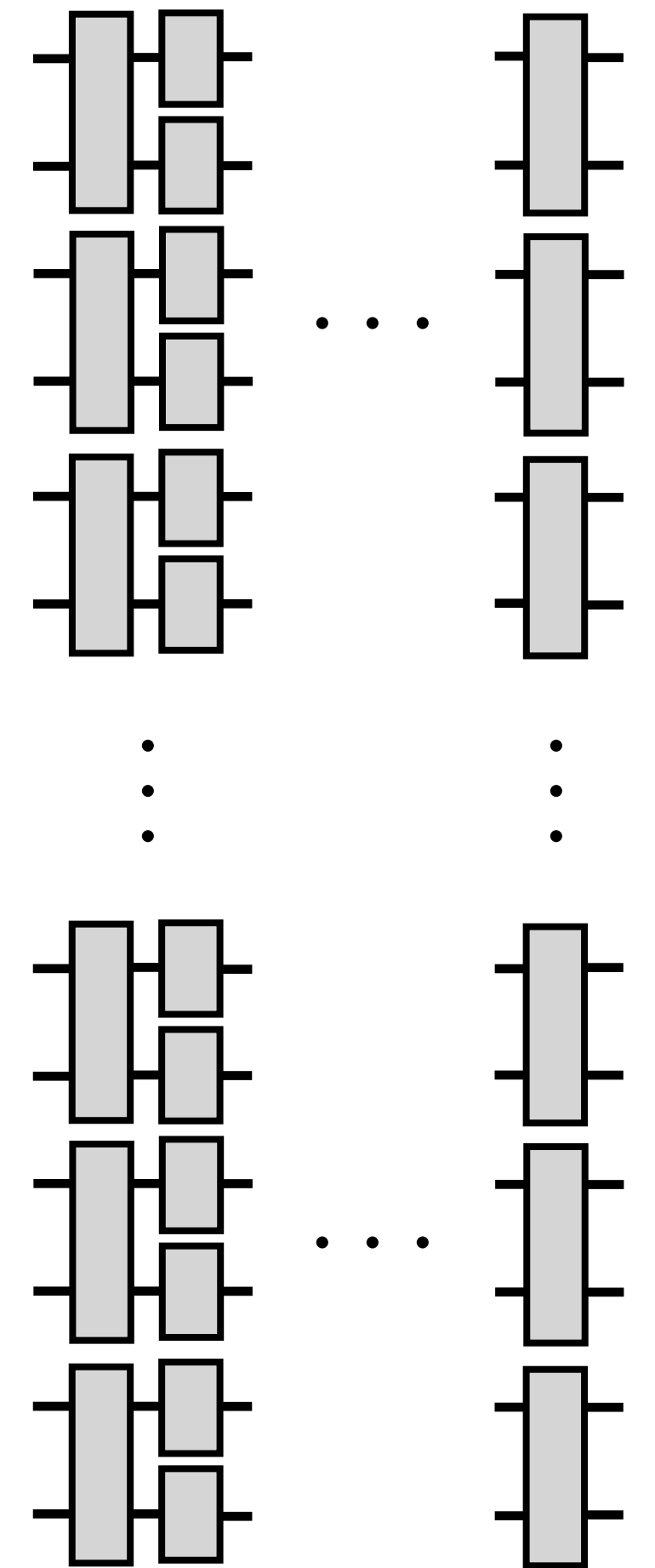
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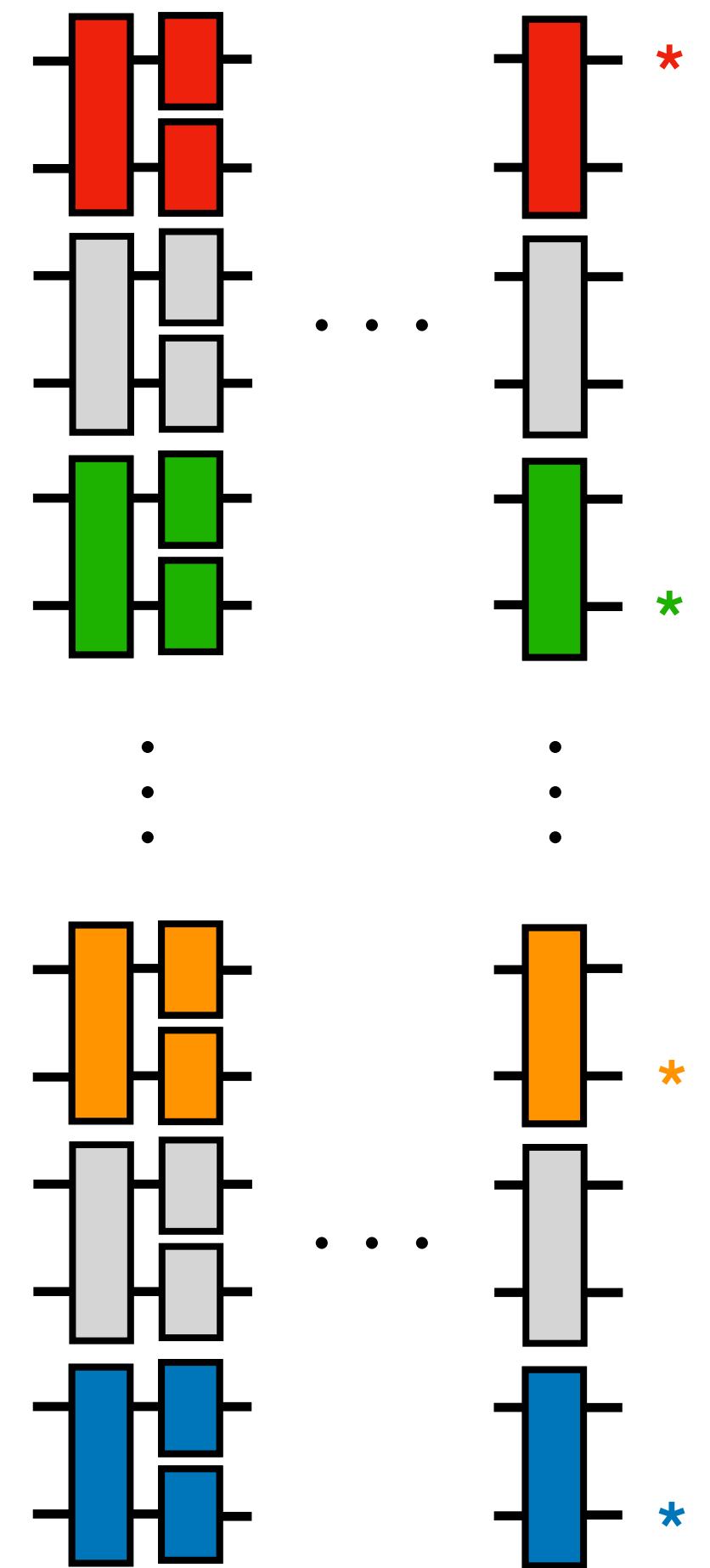
**Idea:** Use the marginal of each output qubit to perform biased sampling!

# A Classical Algorithm Spoofing Linear XEB Using Lightcone



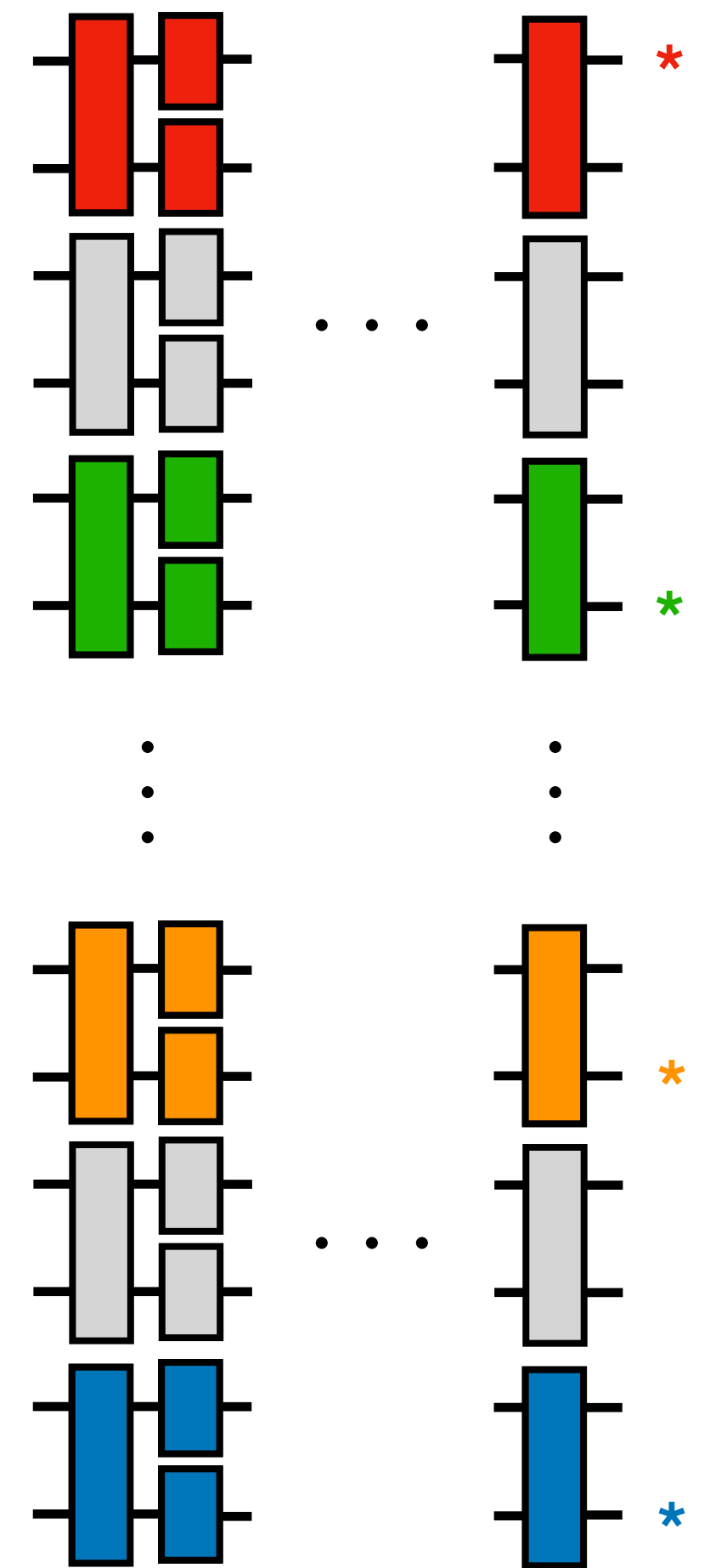
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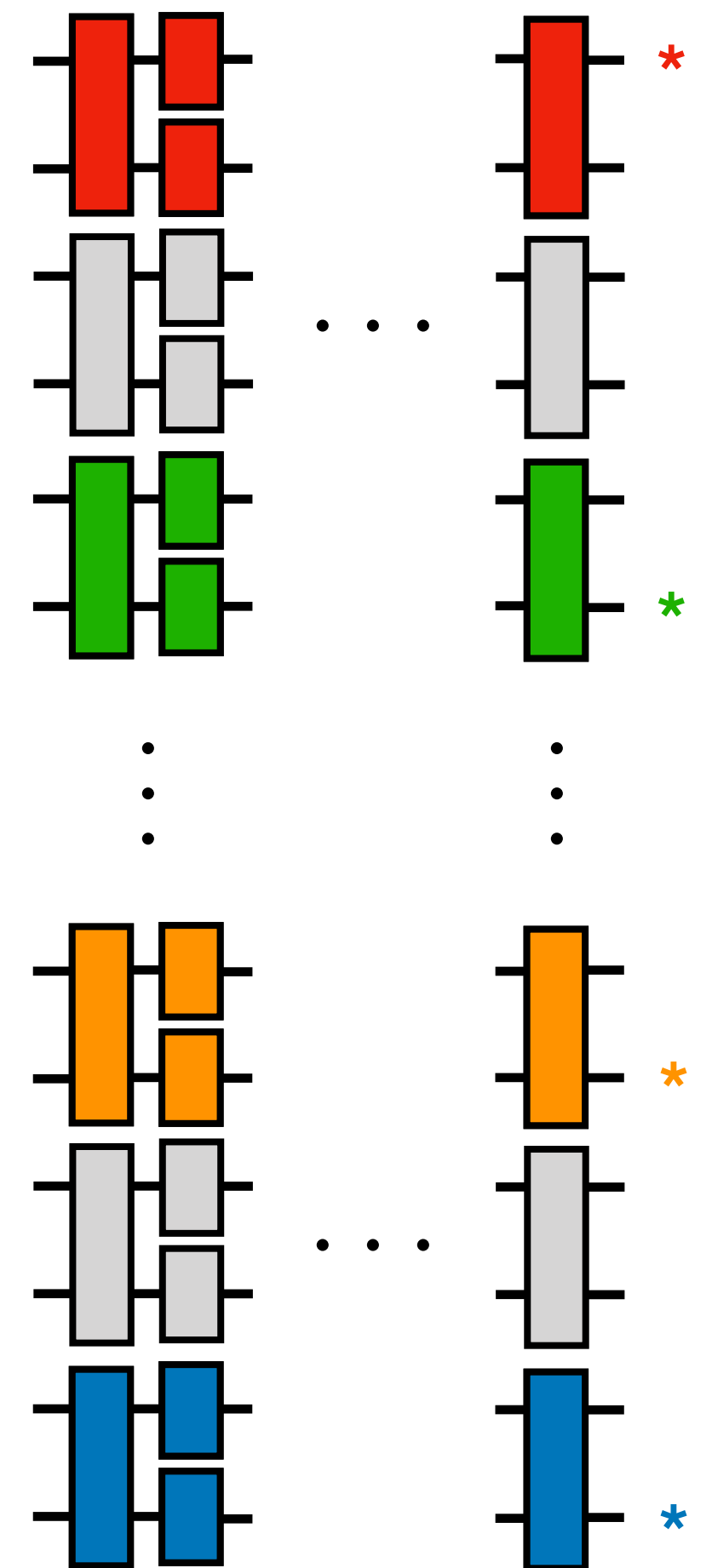
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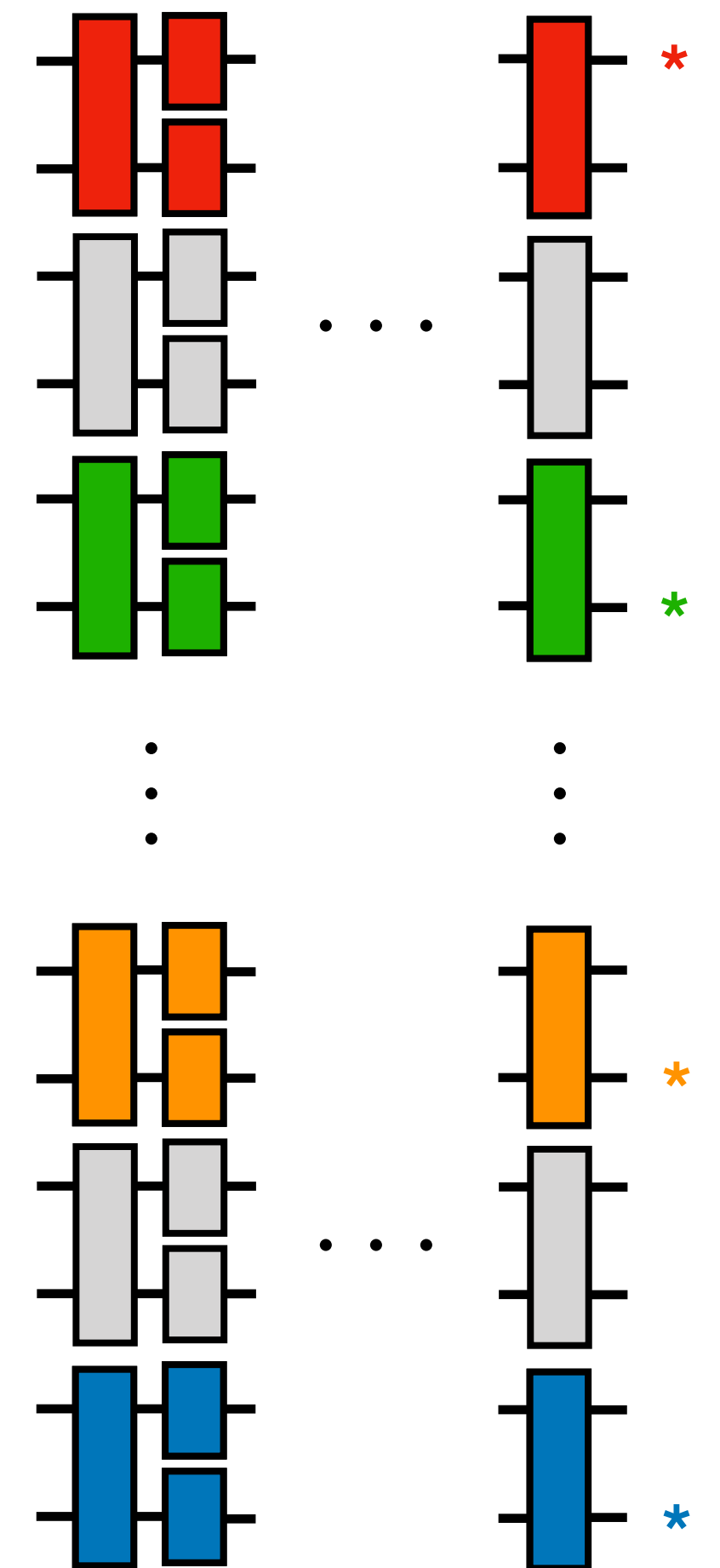
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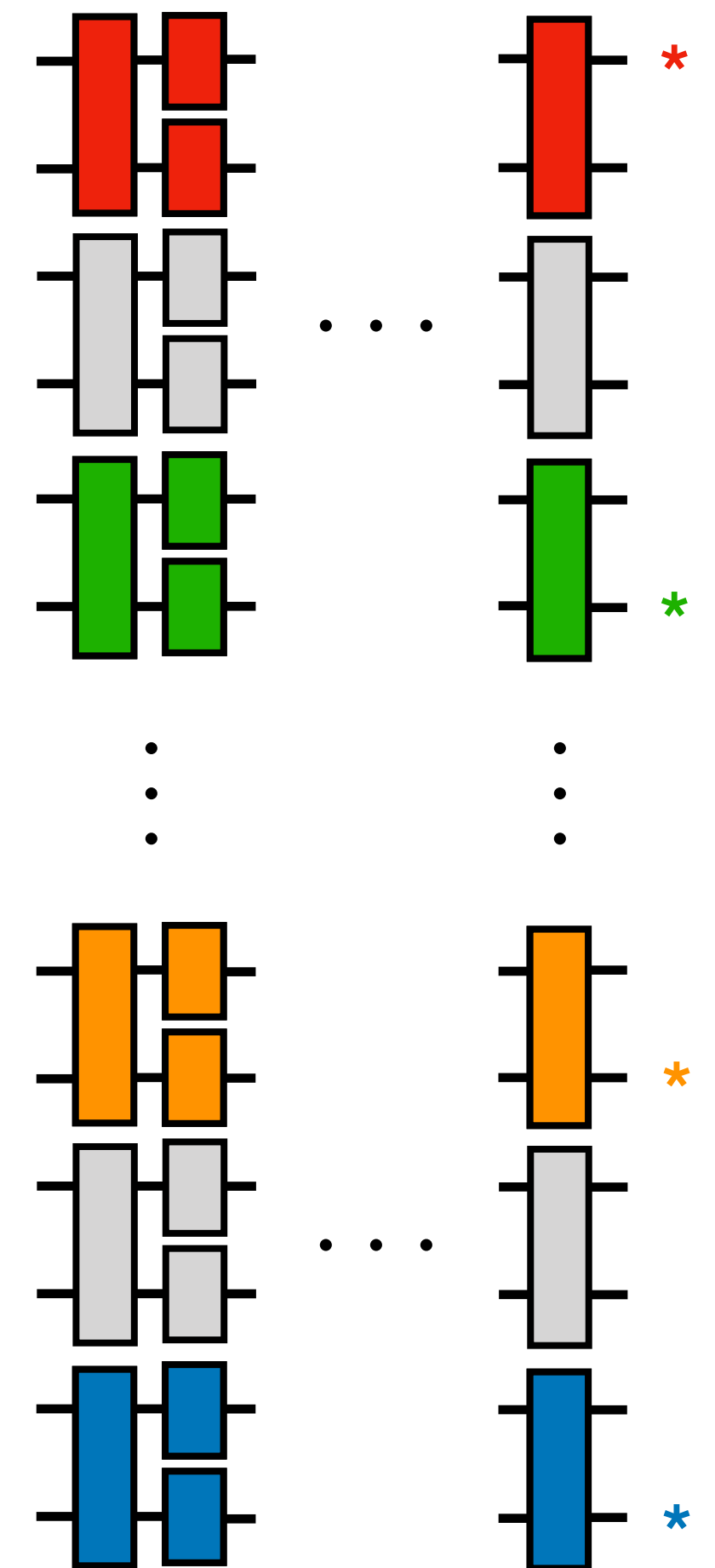
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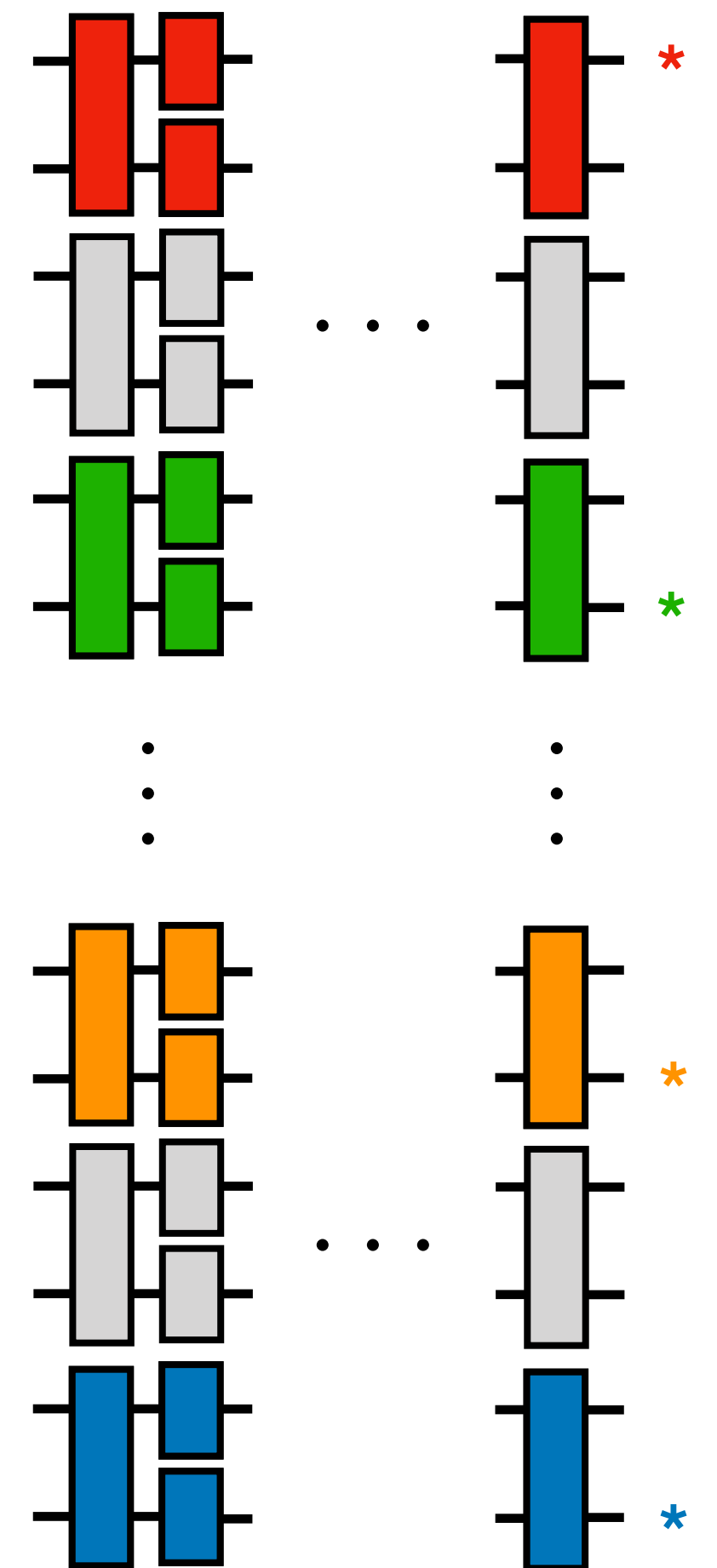
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Theoretical analysis? Empirical performance? Other variants?





# Theoretical Analysis

*First non-trivial classical algorithm challenging Linear XEB*

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**Theorem.**

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**Linear XEB  
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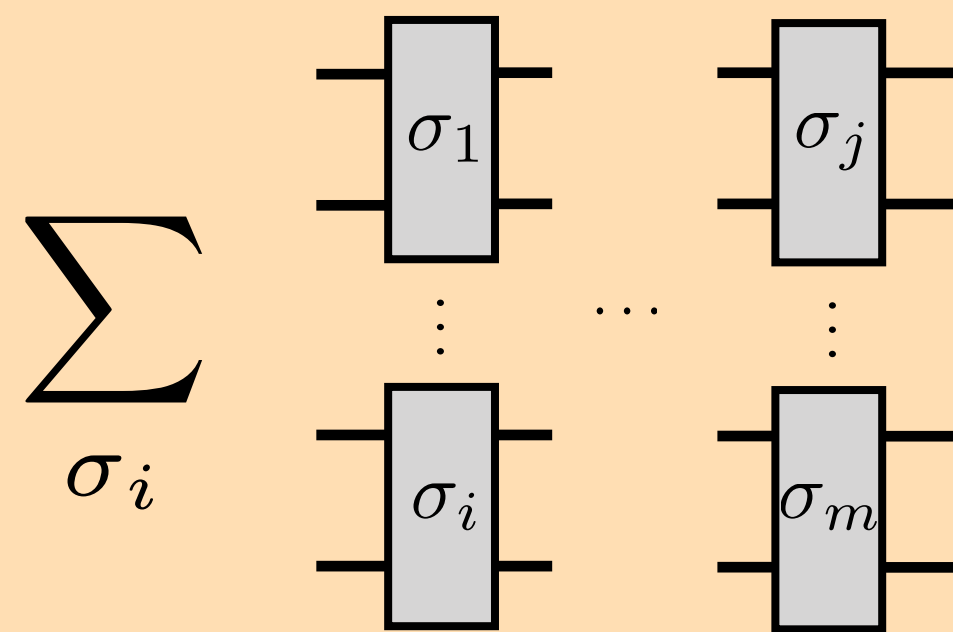
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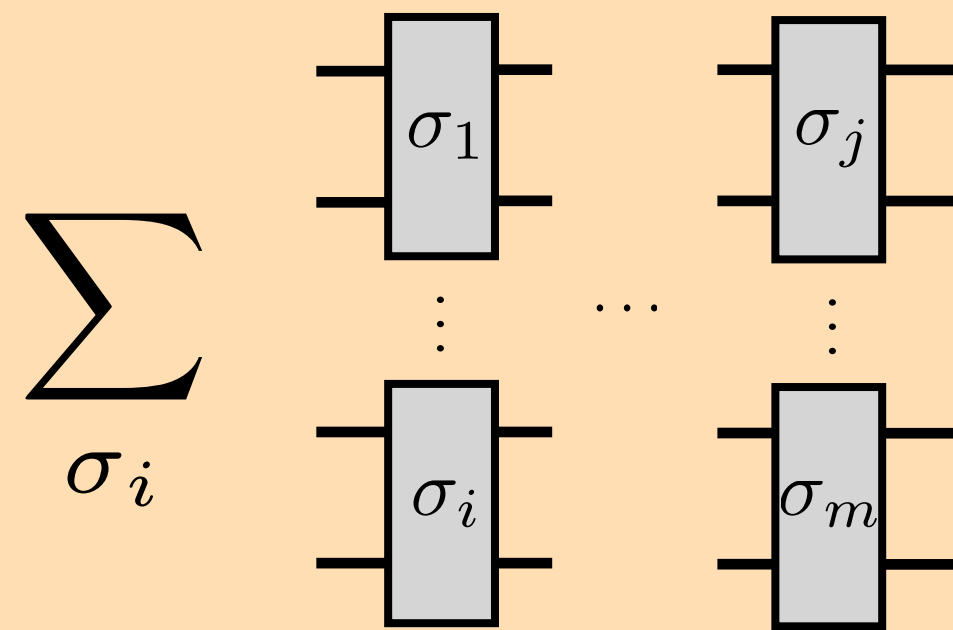


Certain non-negative tensor network

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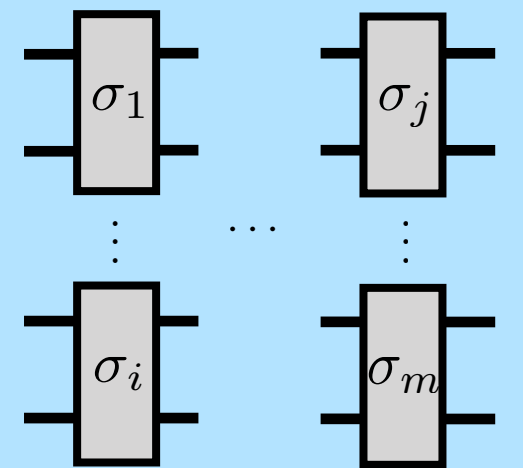
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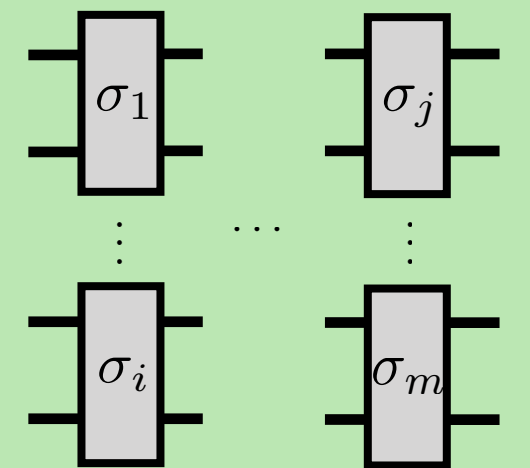


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## Google's Noisy Simulation



## Our Lightcone Algorithm

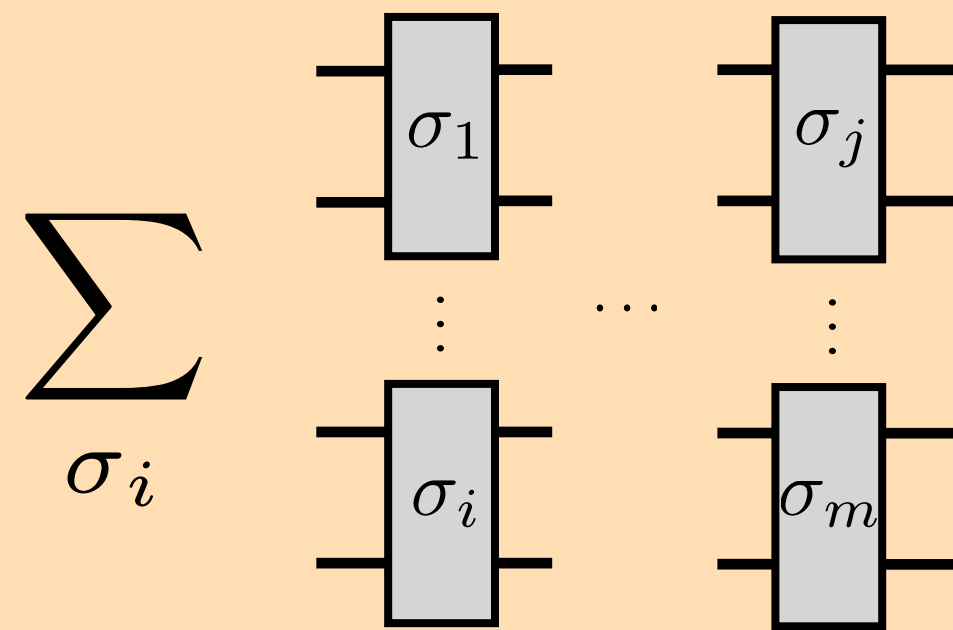




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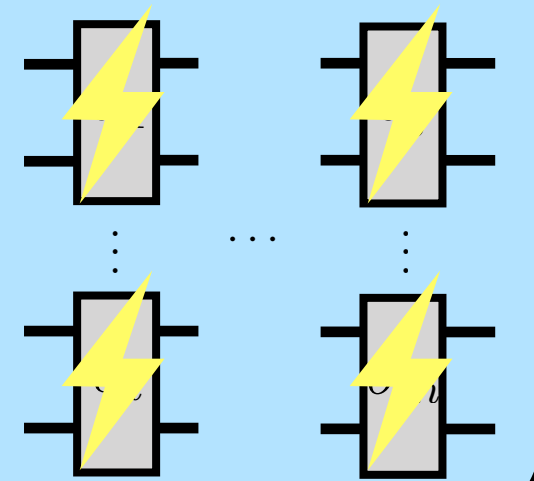
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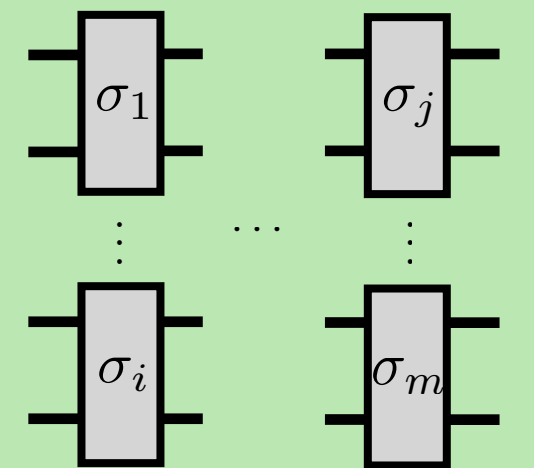
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Noises are inherent in the  
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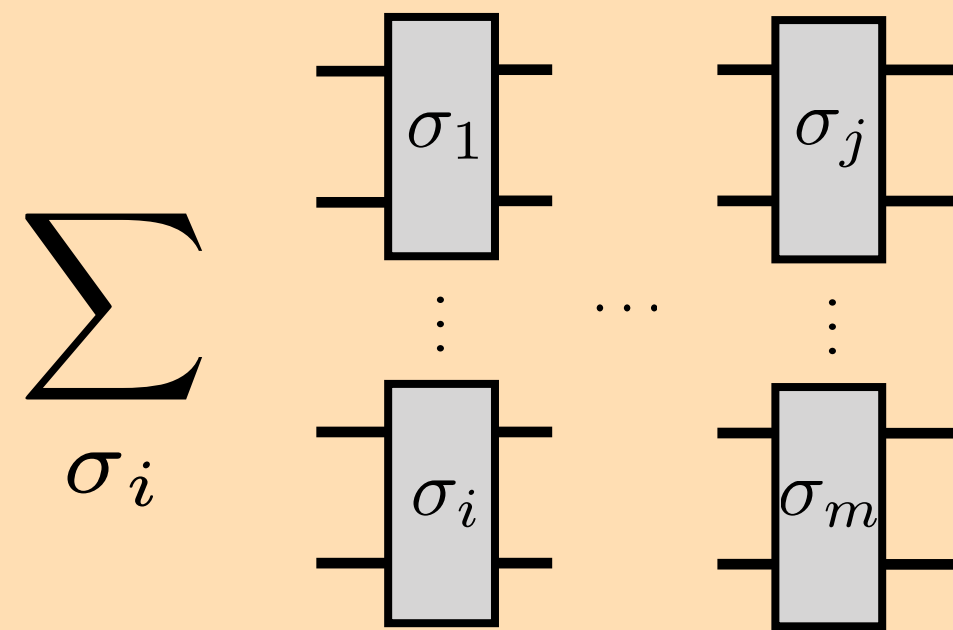
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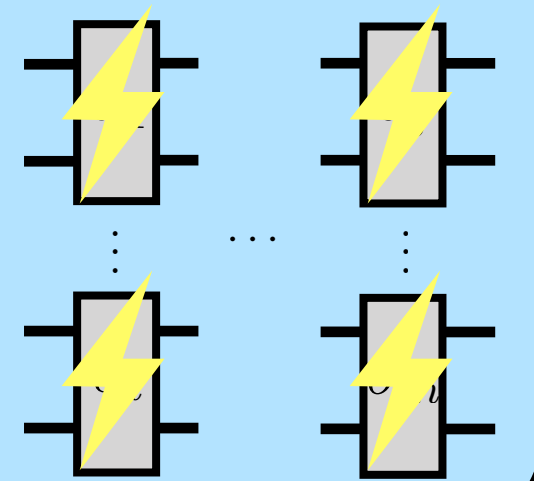
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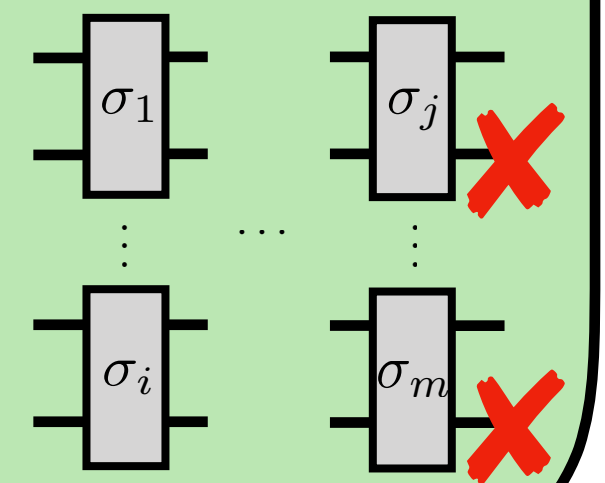
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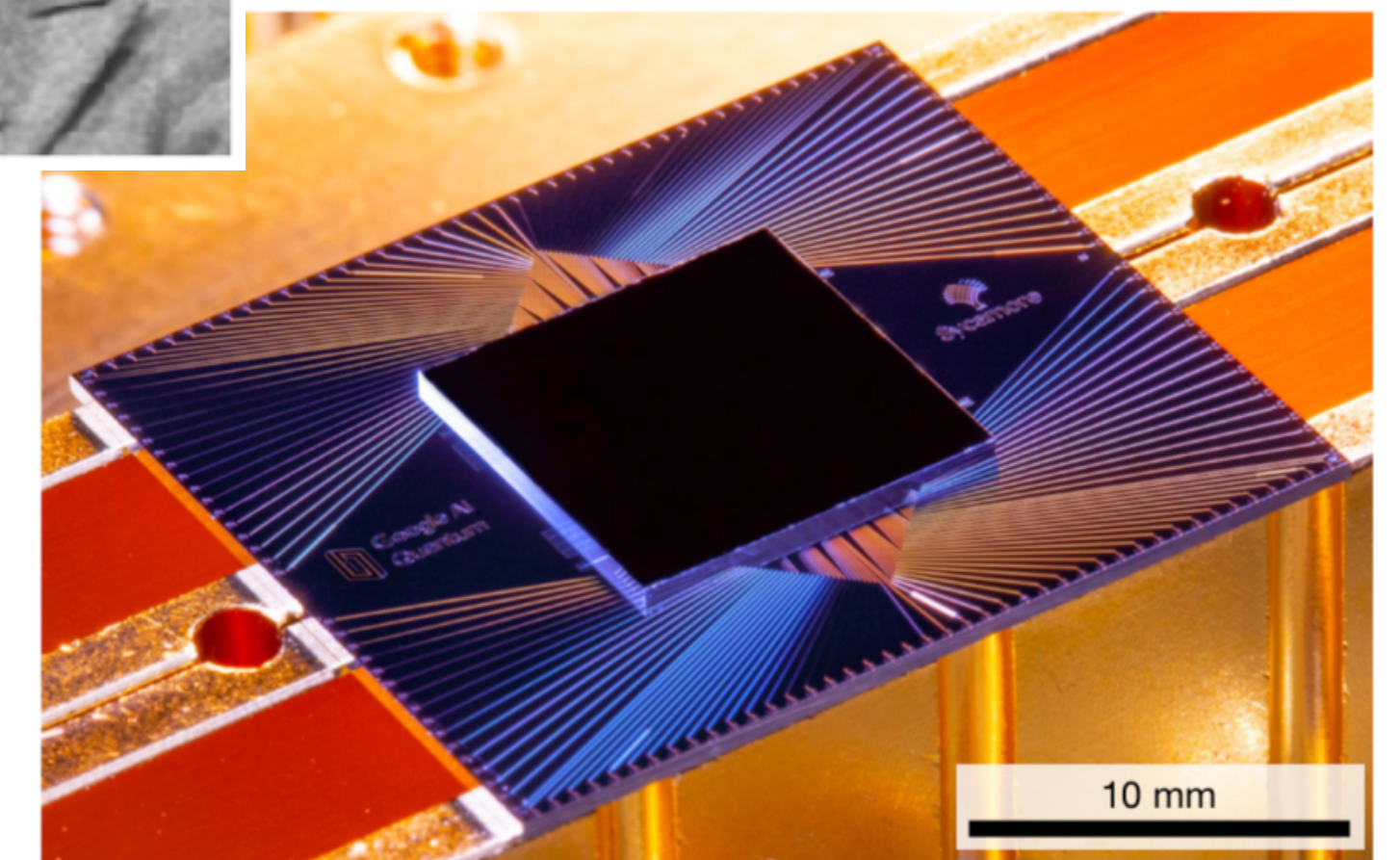
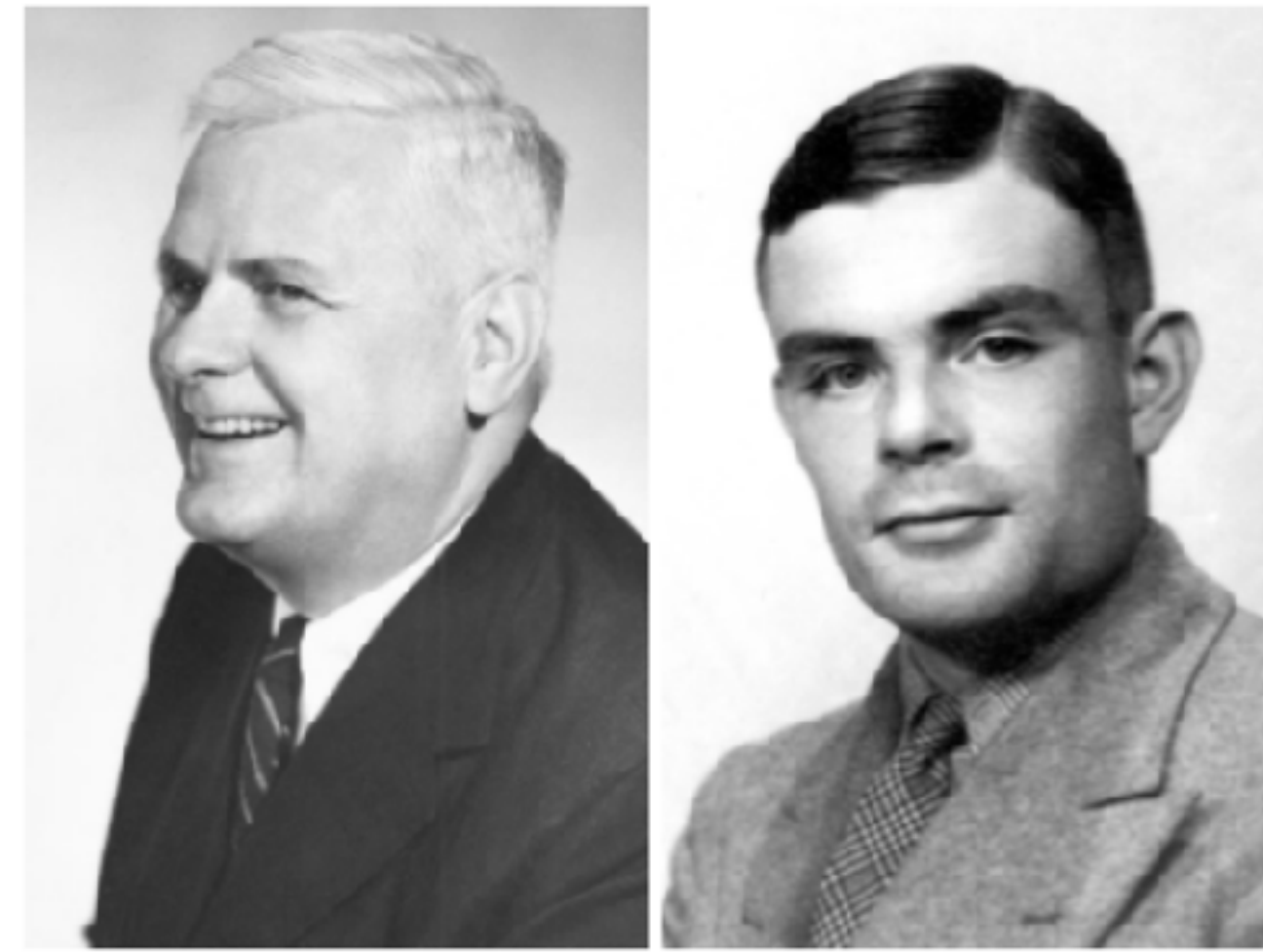
## Our Lightcone Algorithm

Picking disjoint lightcones = adding noise to non-chosen output qubits.



# Perspectives

*We are still few steps away from the quantum supremacy regime?*

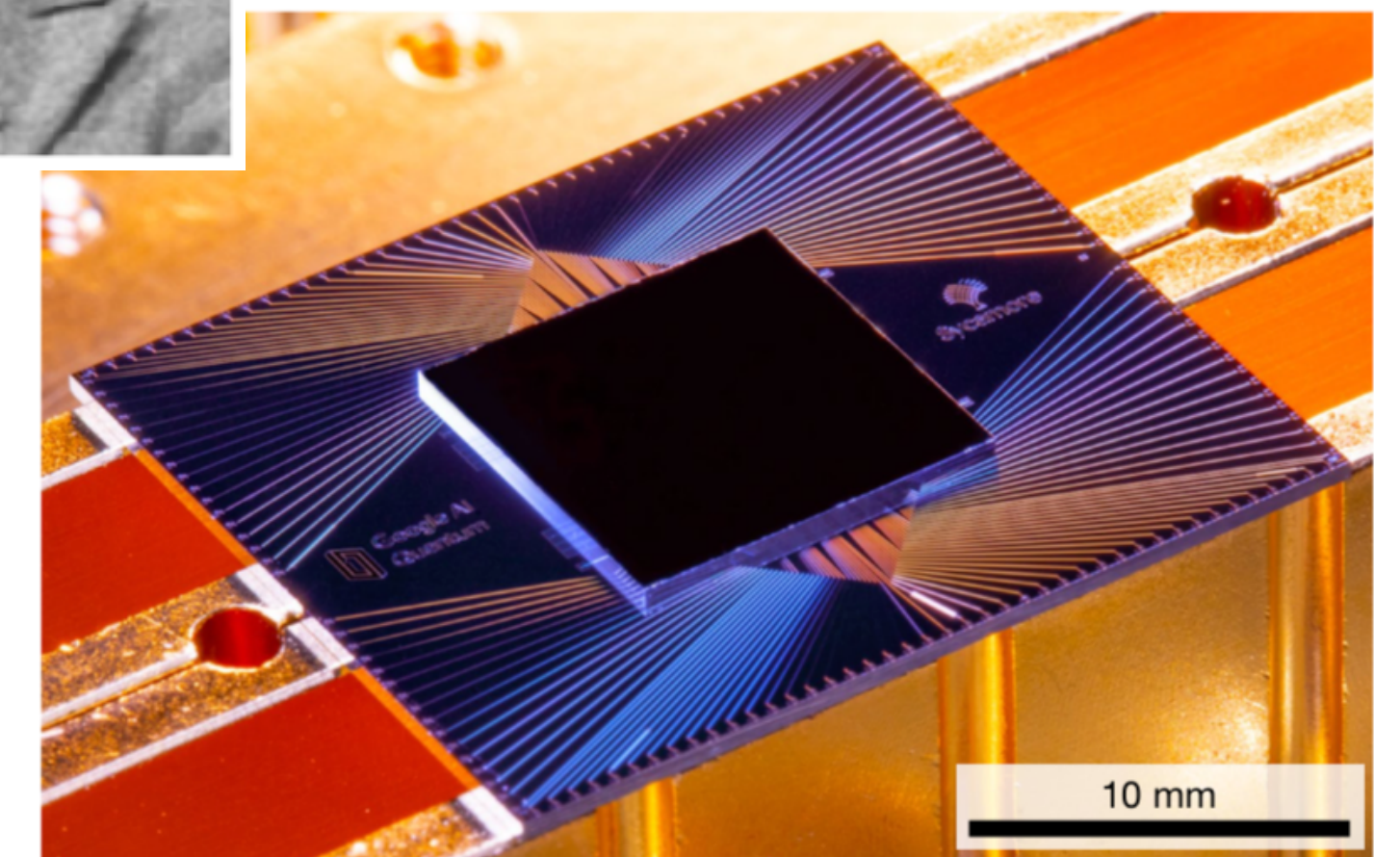
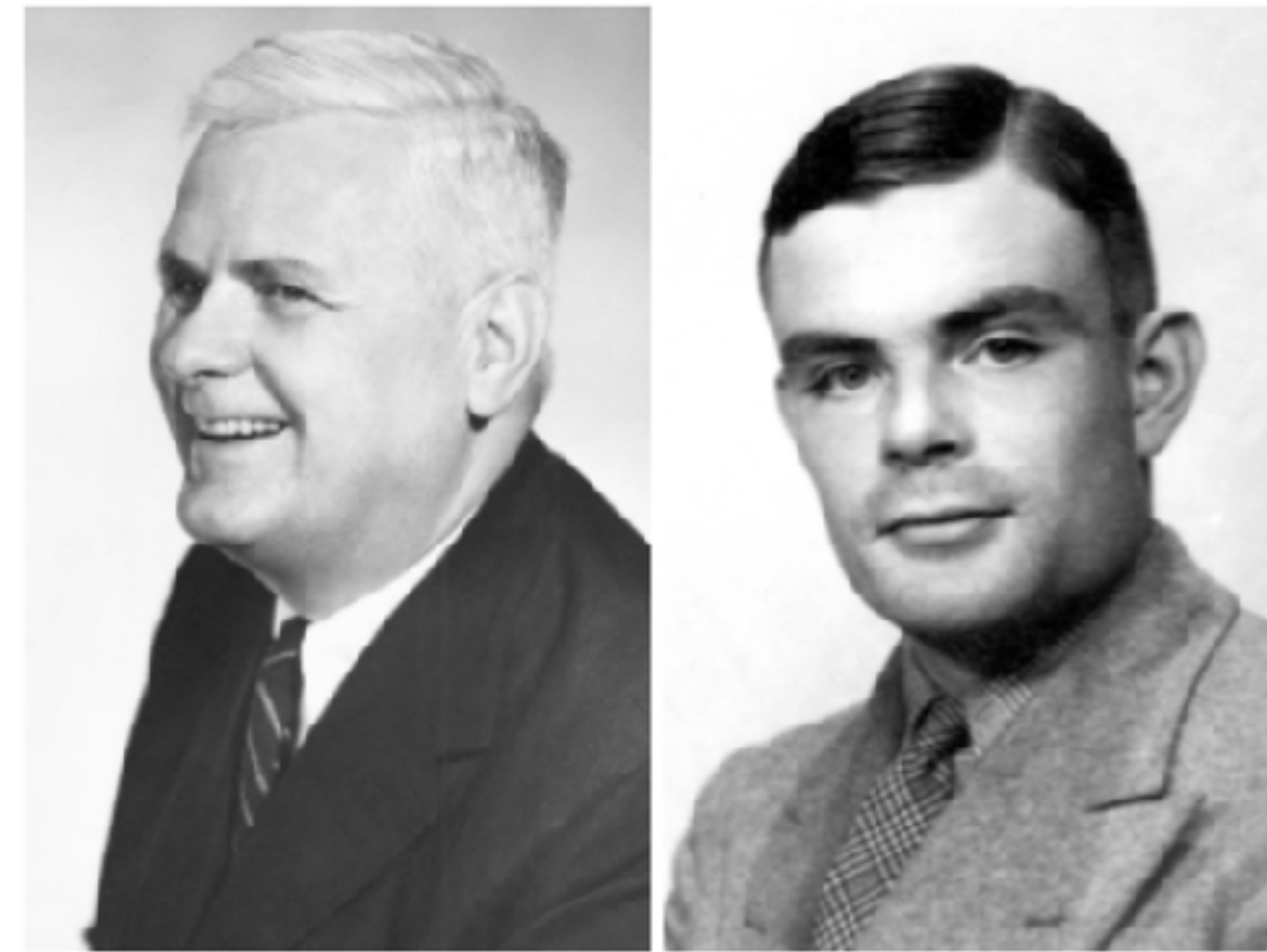




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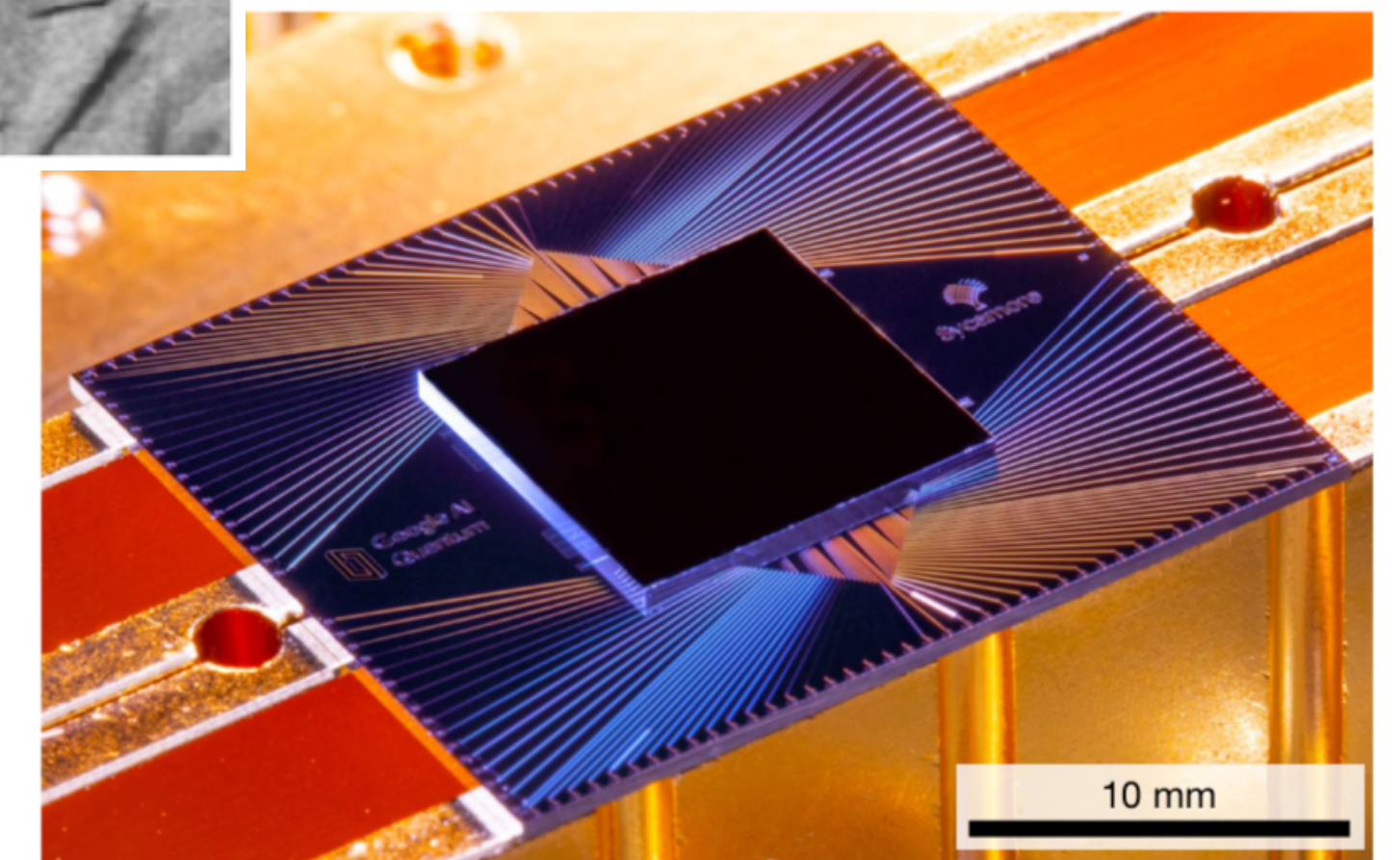
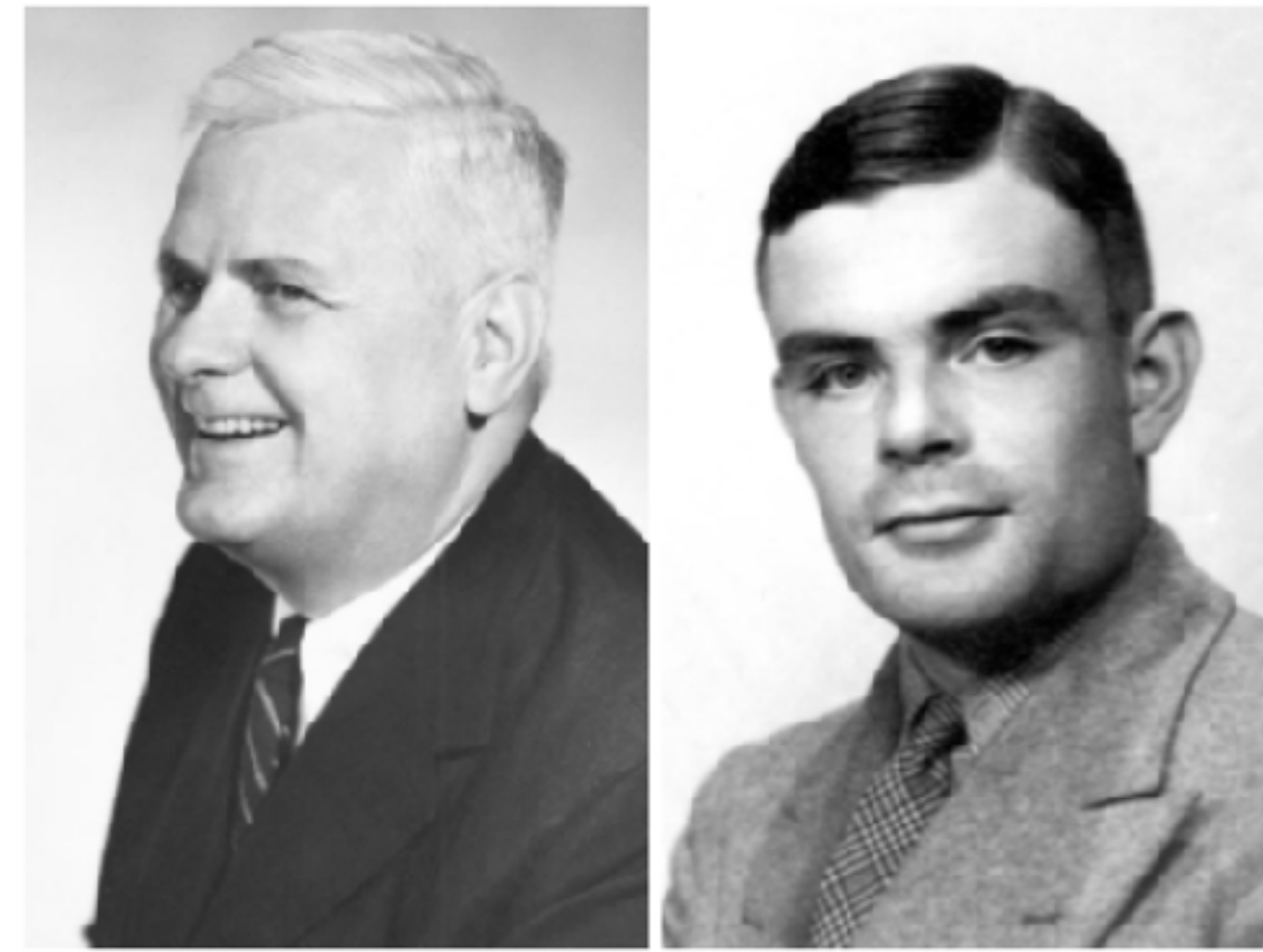




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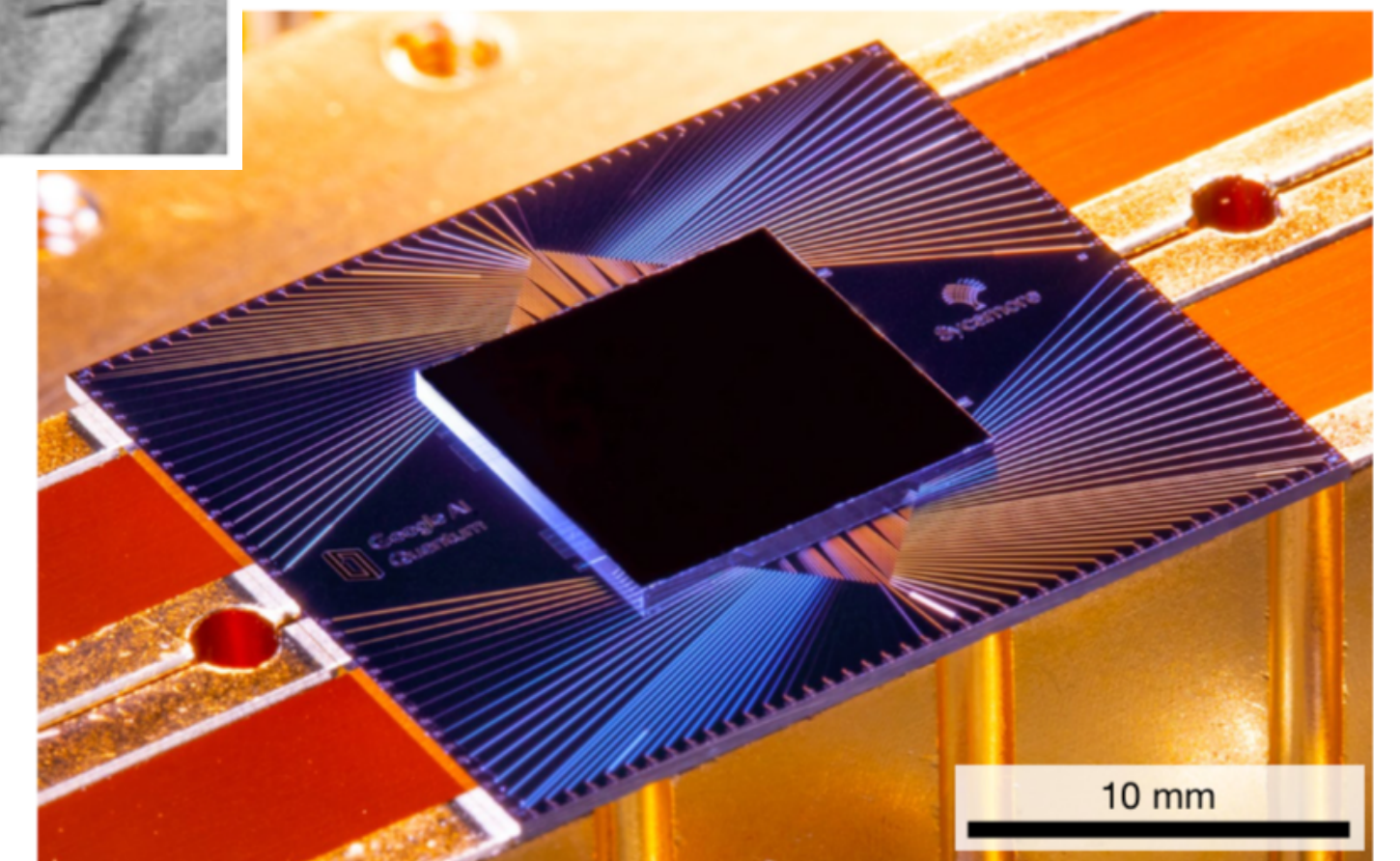
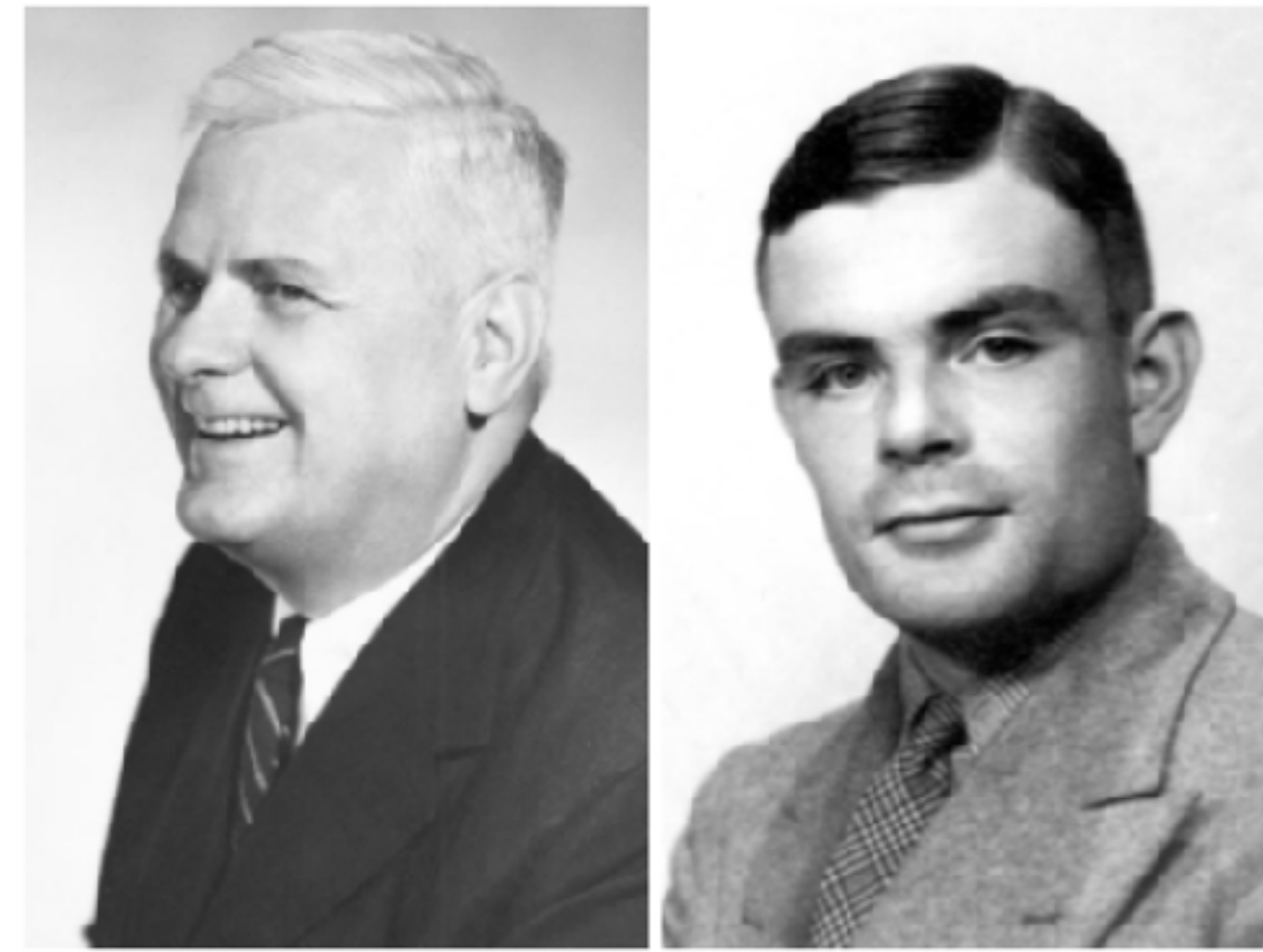




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- A random walk picture for Linear XEB.



# Future Directions

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**Experiment**

**New Proposal?**

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Thanks for your attention!