



# Google AI Quantum

Applications and Challenges with  
Near-term Quantum Hardware

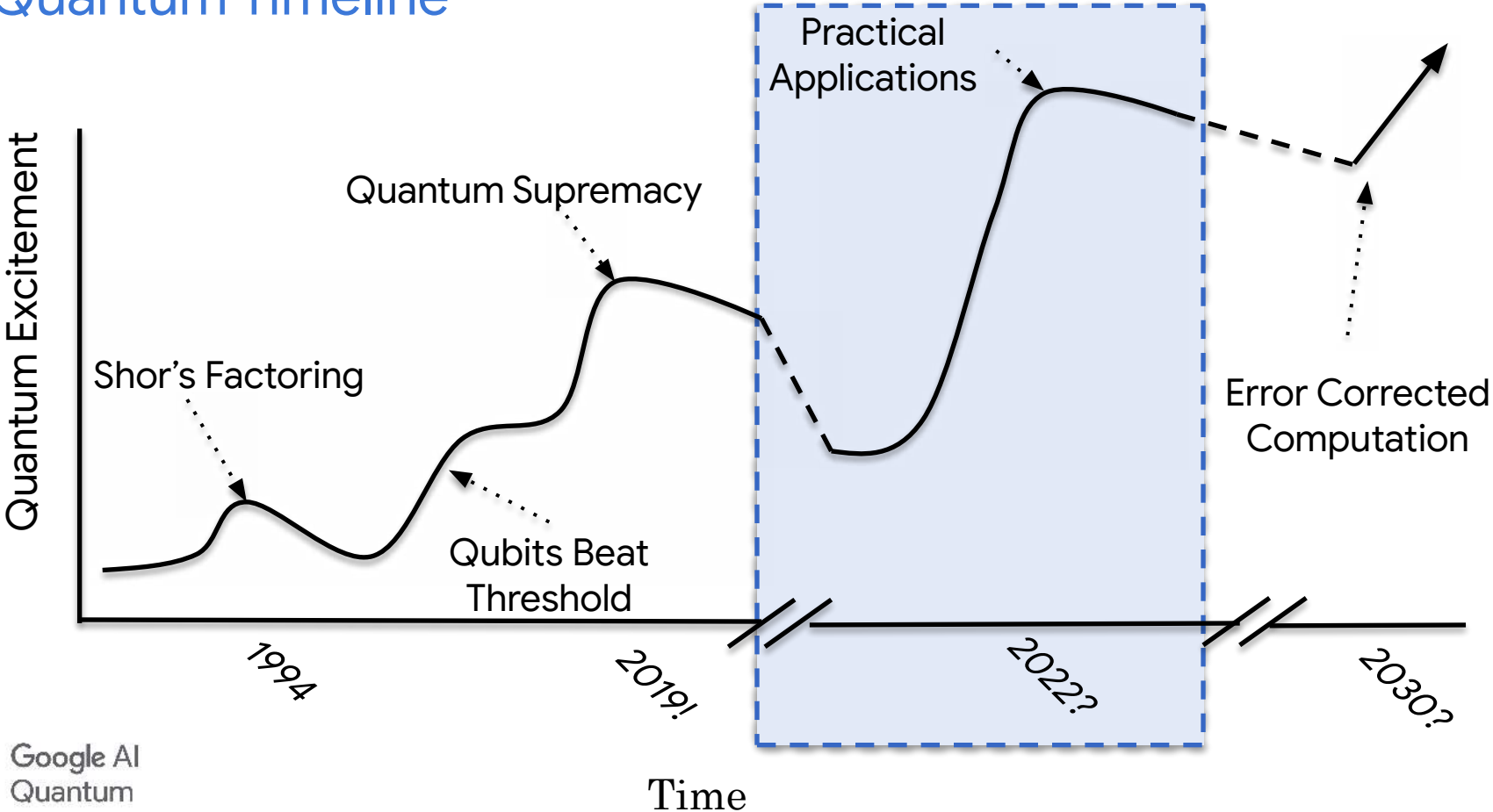
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@JarrodMcClean 

Senior Research Scientist

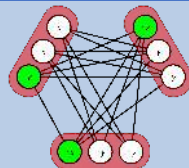
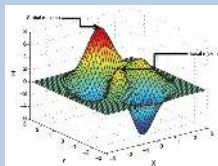


# Quantum Timeline

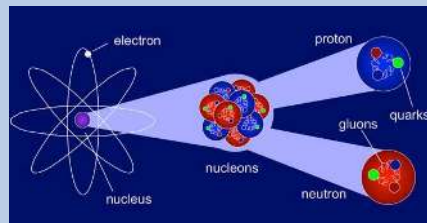
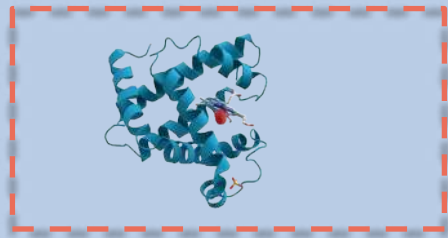


# Early application areas

## Optimization



## Quantum Simulation



Quadratic Speedup

1 year  $\rightarrow$  2 weeks

$10^{82}$  years  $\rightarrow$  300 seconds

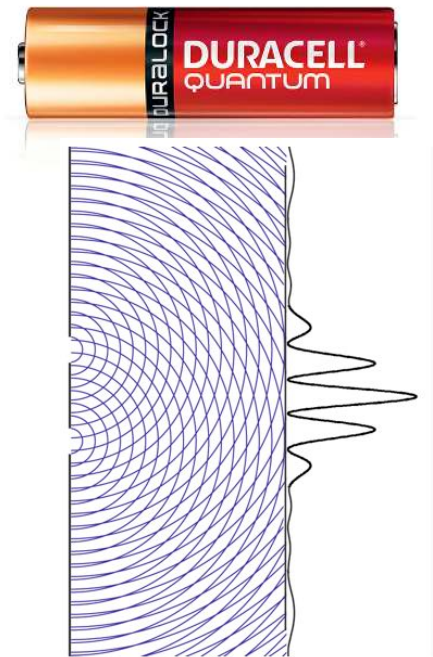
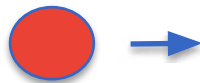
Exponential Speedup

Age of universe  $\sim 14 \times 10^9$  years

# What is quantum?



“Classical”



“Quantum”

**Quantum System** – A physical system operated in a regime where we need effects like discrete energy levels and interference are required to accurately describe it.

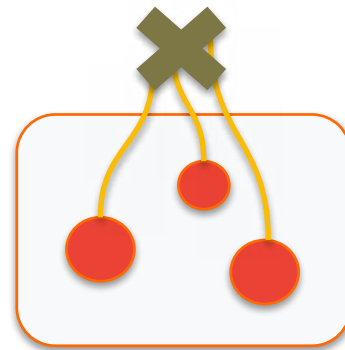
# Simulation



Orrery



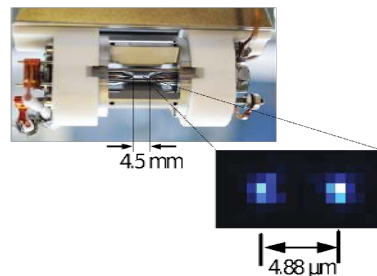
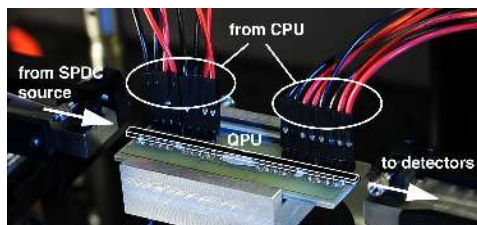
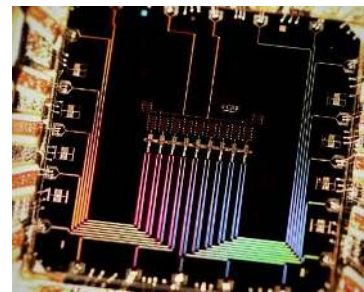
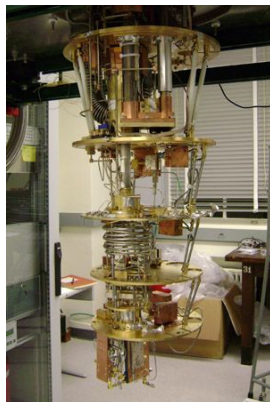
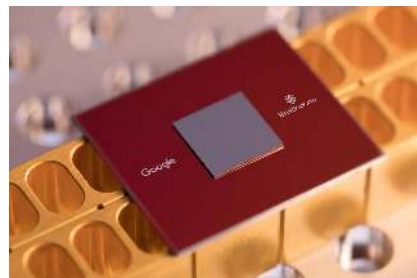
Antikythera Mechanism (125 B.C)



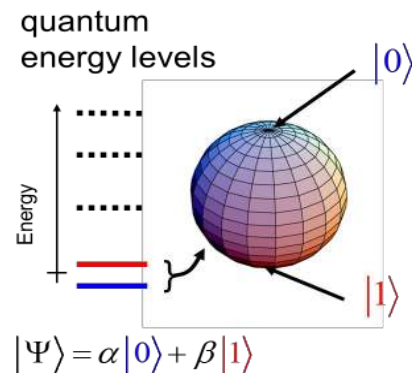
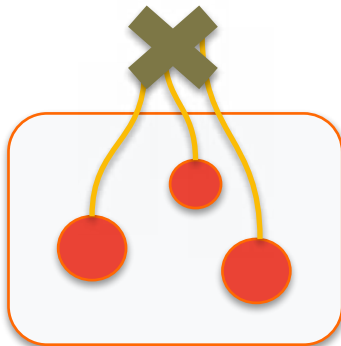
Quantum System  $\rightarrow$  Quantum System



# Quantum systems



# Quantum simulation - the quantum advantage



Abstraction

Quantum Simulation

Quantum Computation

- Factoring Products of Two Large Primes
- Linear Partial Differential Equations
- Solution of Linear Equations

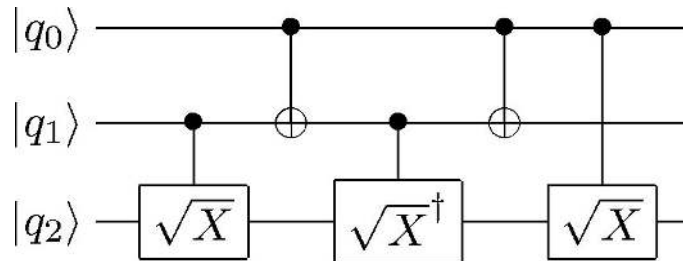
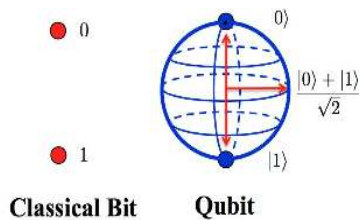
Prepare

Evolution

Measurement

$\{|\Psi_i\rangle, E_i\}$

# Quantum computing abstraction



$$|0\rangle = \begin{pmatrix} 1 \\ 0 \end{pmatrix}$$

$$|1\rangle = \begin{pmatrix} 0 \\ 1 \end{pmatrix}$$

$$X = \text{NOT} = \sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$$

$$X |0\rangle = |1\rangle$$

$$X |1\rangle = |0\rangle$$

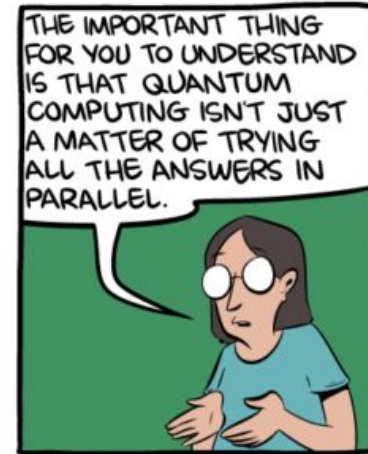
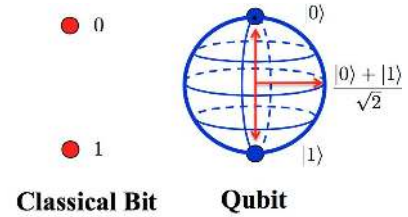


# Debunking quantum myths

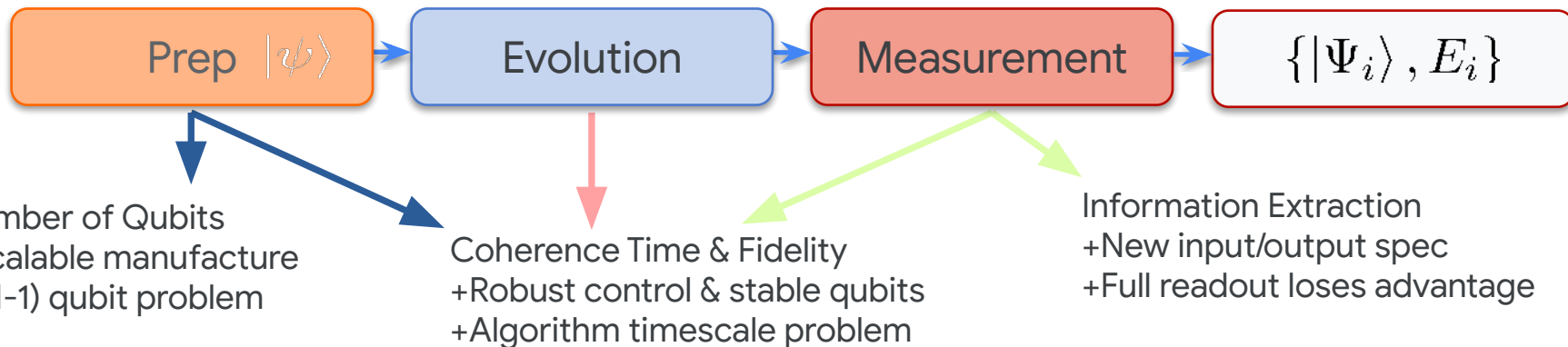
**MYTH 1:** Faster/better because it can use an exponential number of states

**MYTH 2:** Faster/better because bits can be 0 and 1 at the same time.

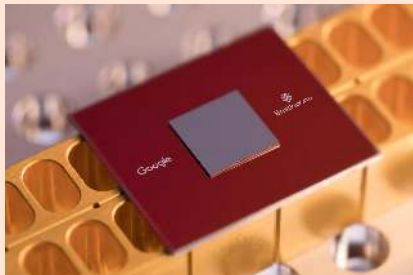
**MYTH 3:** Work by computing all the answers in parallel



# Challenges in quantum computation



## Better Hardware



## Co-Design Better Algorithms

**Previous:** Coherence time flexible

**Future:**

- Improved coherence time flexibility, novel property extraction, and demonstration
- Qubit number flexible algorithms and larger demonstrations

# Thinking differently for speedups

## Classical:

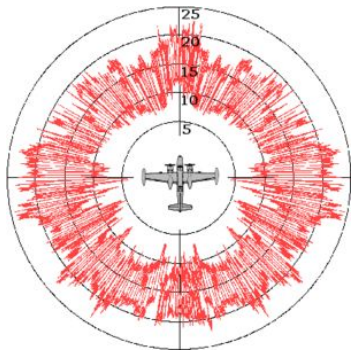
$$Ax = b$$

Solution translates to writing down the entries of  $x$

## Quantum\*:

$$A|x\rangle = |b\rangle$$

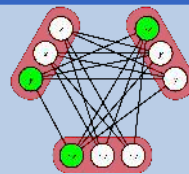
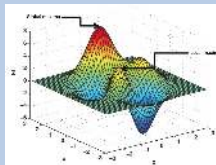
Solution translates to preparing state  $x$  from which one can sample



Solving the problem, not  
reproducing the classical  
algorithm!

# Early application areas

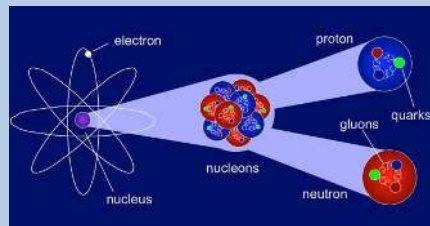
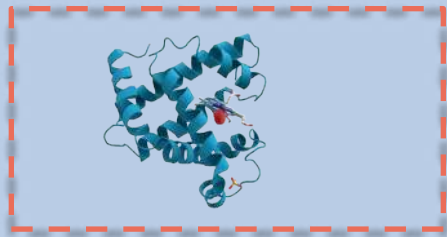
## Optimization



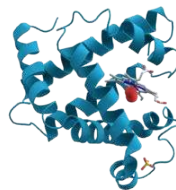
## Relation Representation



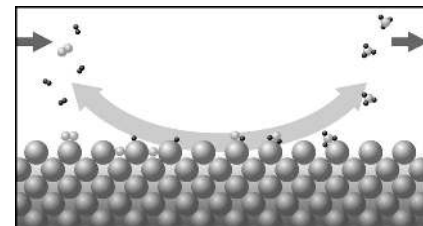
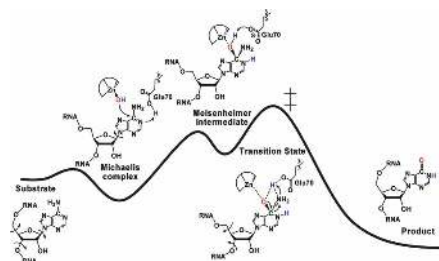
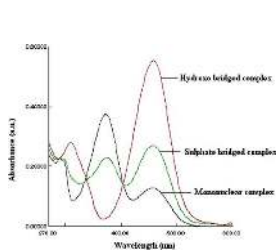
## Quantum Simulation



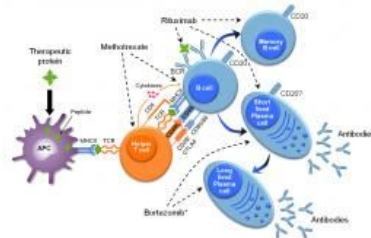
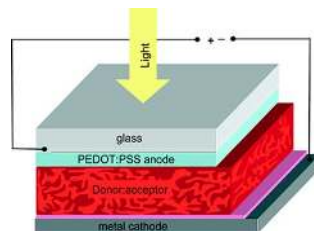
# Simulating Chemistry



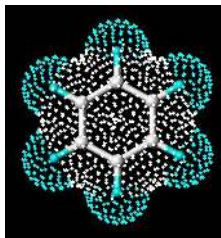
## Understanding



## Control



# Electronic structure



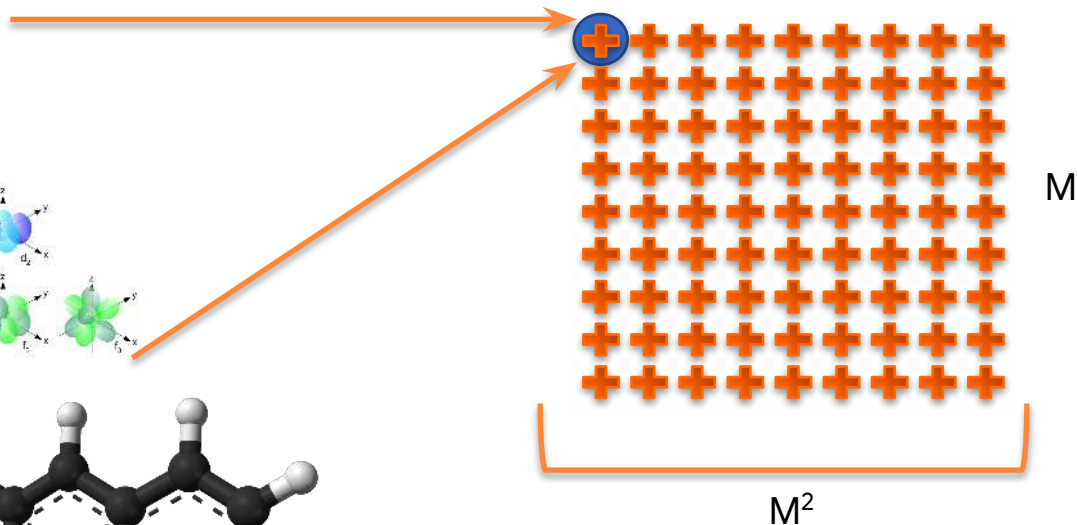
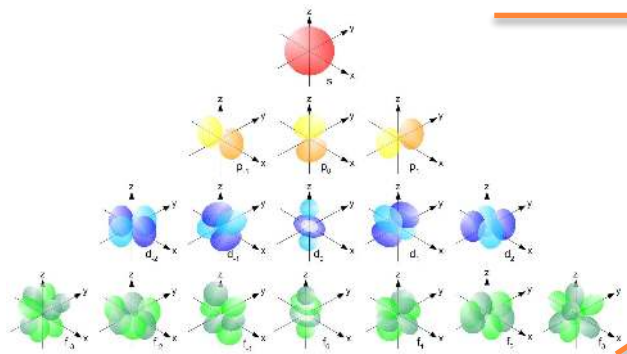
$$\mathcal{H} |\psi\rangle = E |\psi\rangle$$

“The underlying physical laws necessary for the mathematical theory of a large part of physics and **the whole of chemistry** are thus completely known, and the difficulty is only that the exact application of these laws leads to equations much too complicated to be soluble.”

-Paul Dirac



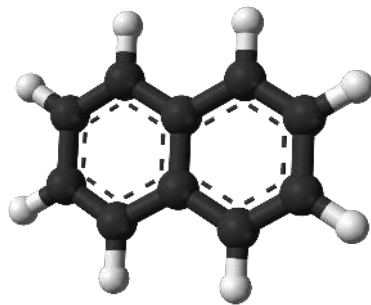
# Challenge of chemistry - power of quantum



$$D = M^N$$

$$M = 100$$

$$N = 80$$

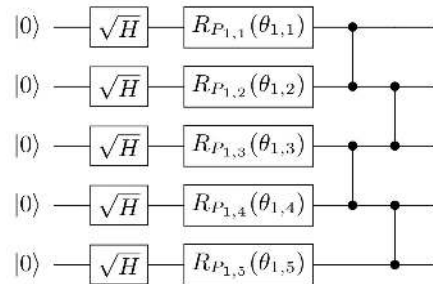
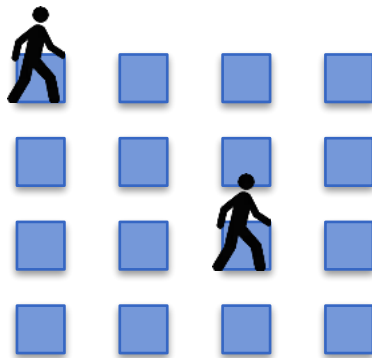
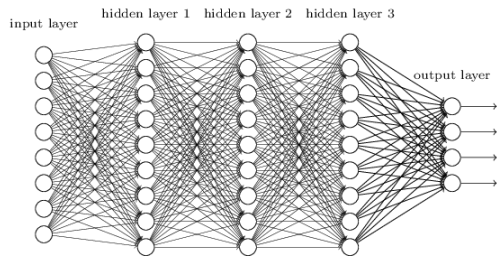


Particles in universe

$$10^{80}$$

$$D = 100^{80} = 10^{160}$$

# But classical probability distributions...?



$$P_1(\text{Store}_i)$$

$$P_2(\text{Store}_j)$$

$$P_{12}(\text{Store}_i, \text{Store}_j) \neq P_1(\text{Store}_i)P_2(\text{Store}_j)$$

$$O(N^P)$$

# Towards an important problem



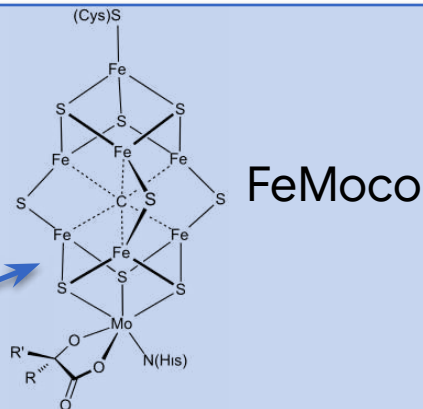
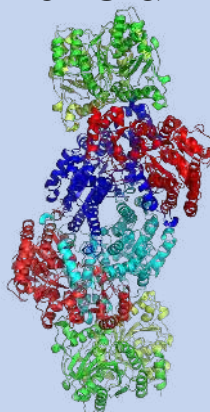
Humans: Haber Process

400°C & 200 atm

1-2% of ALL energy on earth,  
used on Haber process

Nature: Nitrogenase

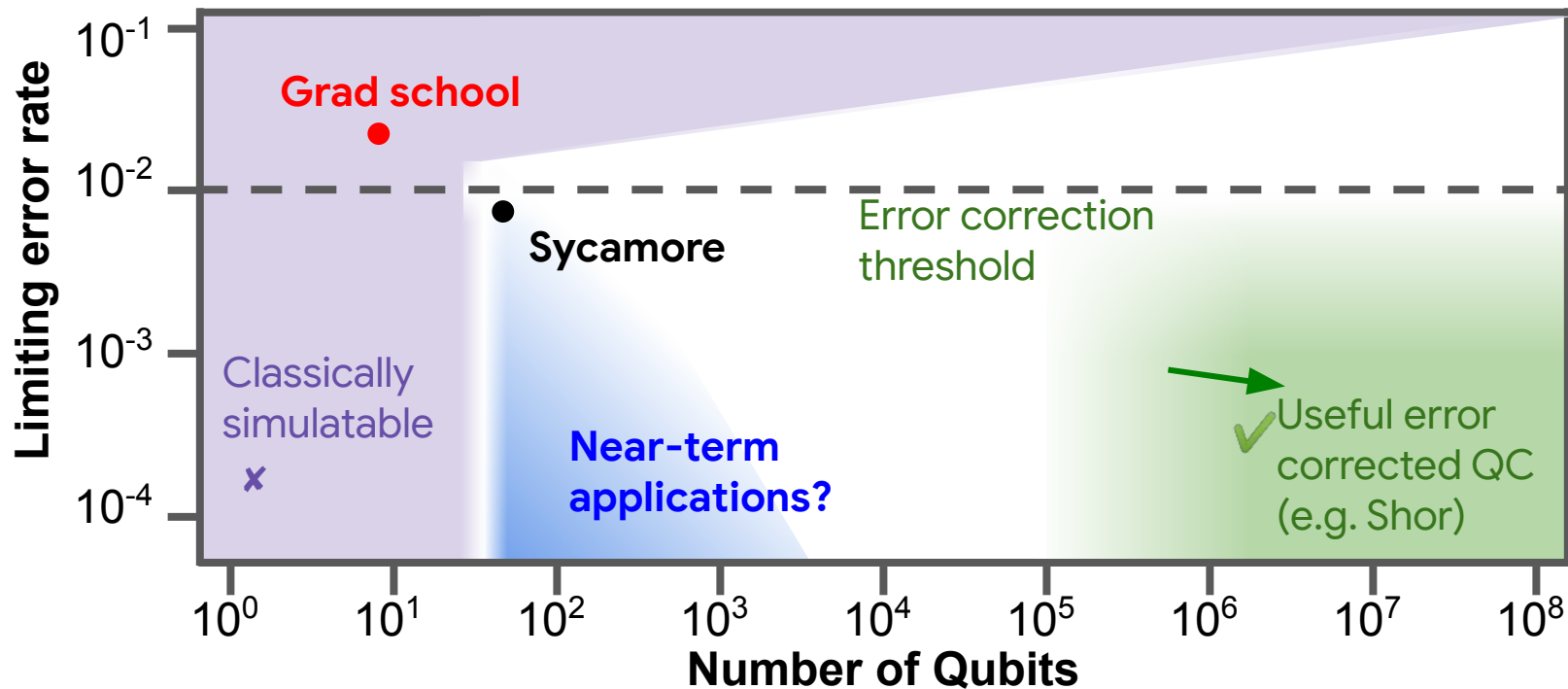
25° C & 1 atm



Beyond current classical methods

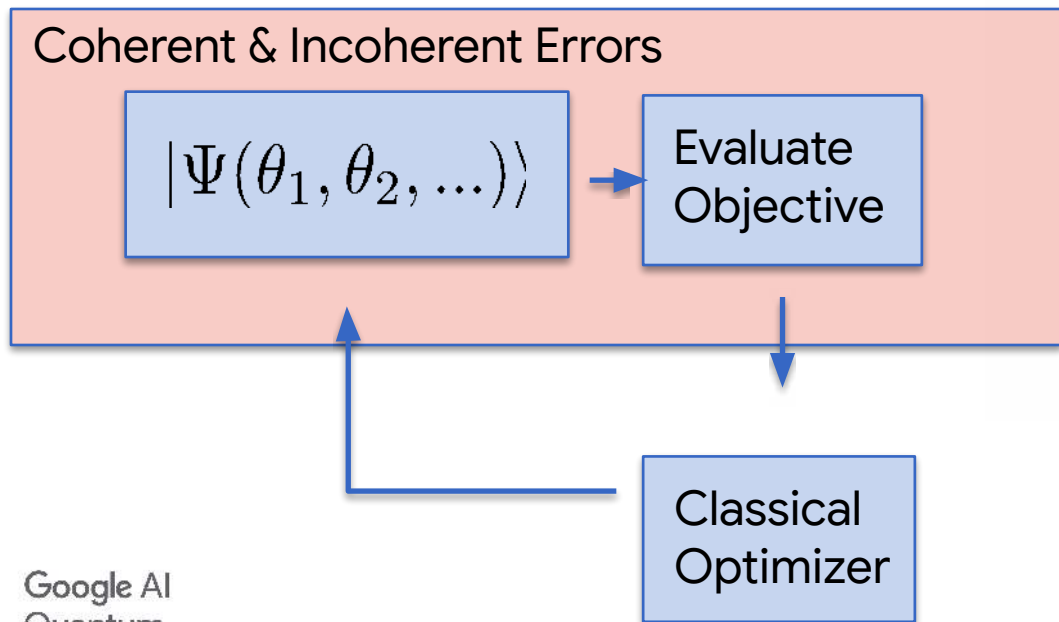
Both electronic structure and substrate  
attachment almost totally unknown

# The road beyond supremacy



# Quantum-Classical variational algorithms in a nutshell

$$\text{Solve } H|\Psi_0\rangle = E_0|\Psi_0\rangle \quad \leftrightarrow \quad \text{Min } \langle \Psi | H | \Psi \rangle$$
$$|\Psi(\theta_1, \theta_2, \dots)\rangle$$

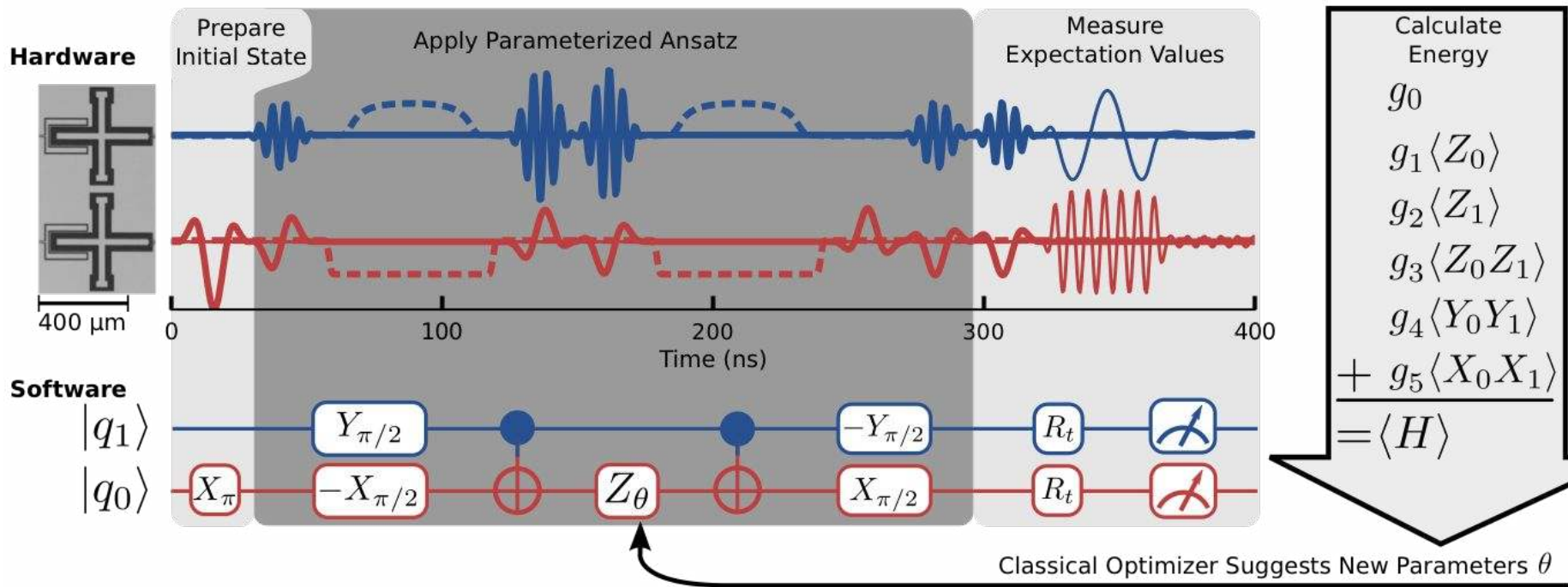


Chemistry  
Nuclear Physics  
Optimization (QAOA)  
Machine learning  
Algorithm learning  
...

Peruzzo<sup>†</sup>, McClean<sup>†</sup>, Shadbolt, Yung, Zhou, Love, Aspuru-Guzik, O'Brien. *Nature Communications*, **5** (4213):1–7, 2014.

<sup>†</sup> Equal Contribution by authors

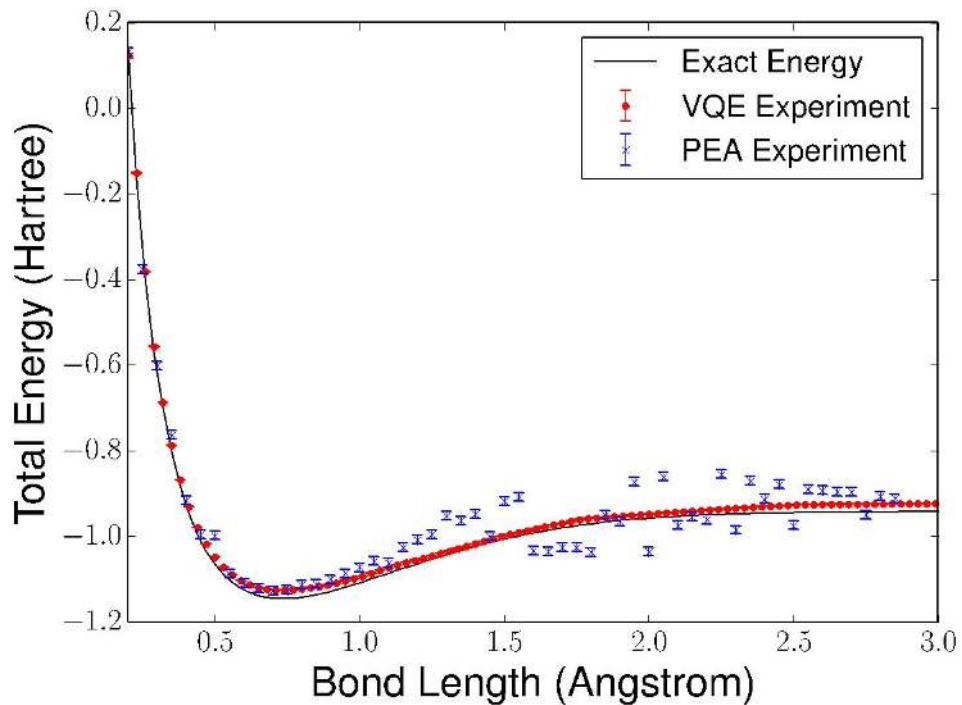
# A network in hardware



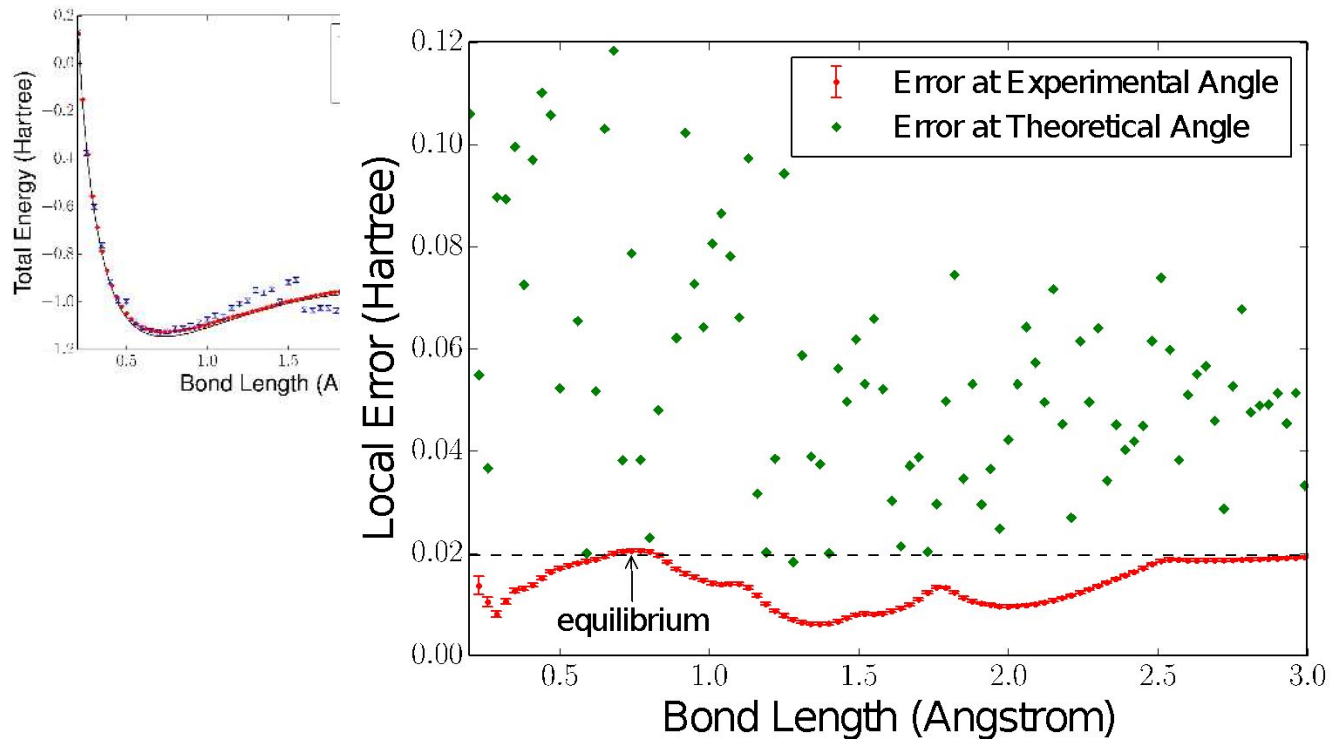
P.J.J. O'Malley, R. Babbush, ..., J.R. McClean et al.  
 "Scalable Simulation of Molecular Energies"  
 Physical Review X 6 (3), 031007 (2016)



# Displays natural error suppression

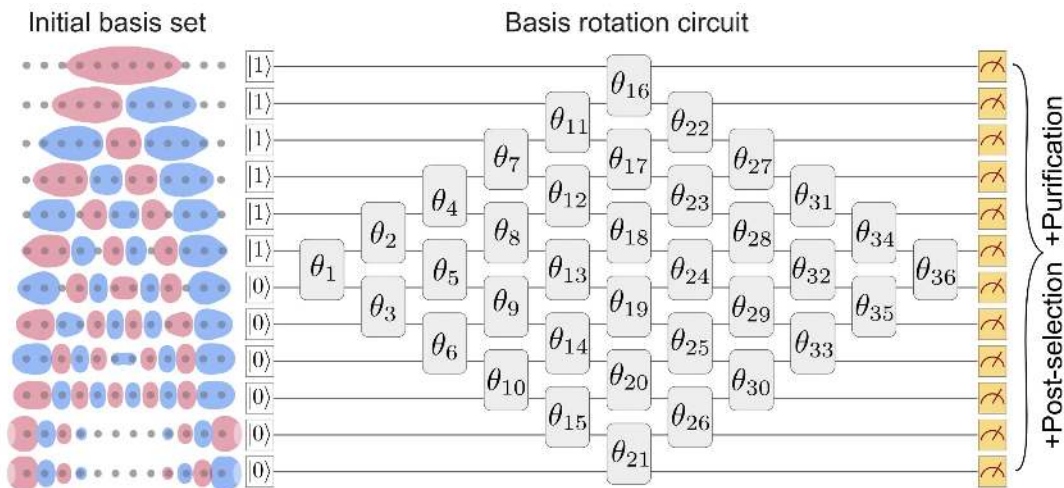


# Displays natural error suppression



# Implementation on Sycamore

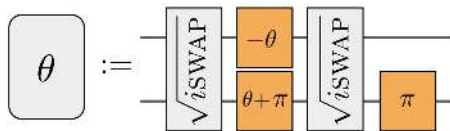
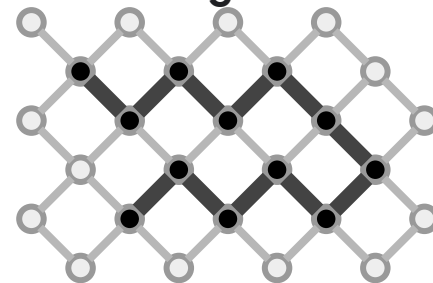
$$U_{\kappa} = \exp \left( \sum_{p,q=1}^N \kappa_{pq} a_p^{\dagger} a_q \right)$$



fsim gate

$$\begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & e^{i\alpha} \cos \theta & e^{i\beta} \sin \theta & 0 \\ 0 & e^{i\gamma} \sin \theta & e^{i\delta} \cos \theta & 0 \\ 0 & 0 & 0 & e^{i\varphi} \end{pmatrix}$$

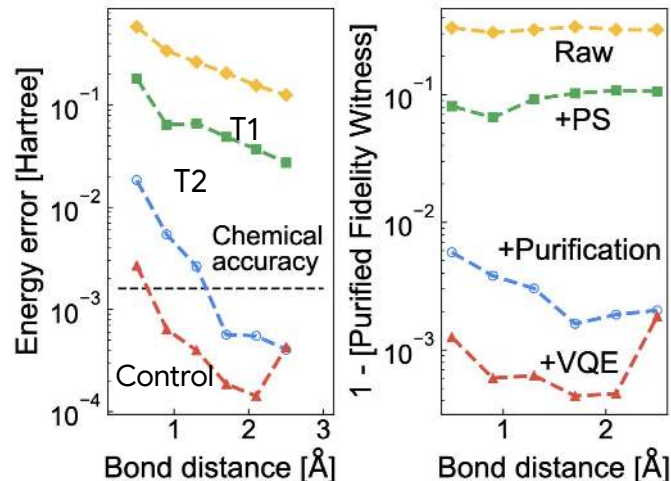
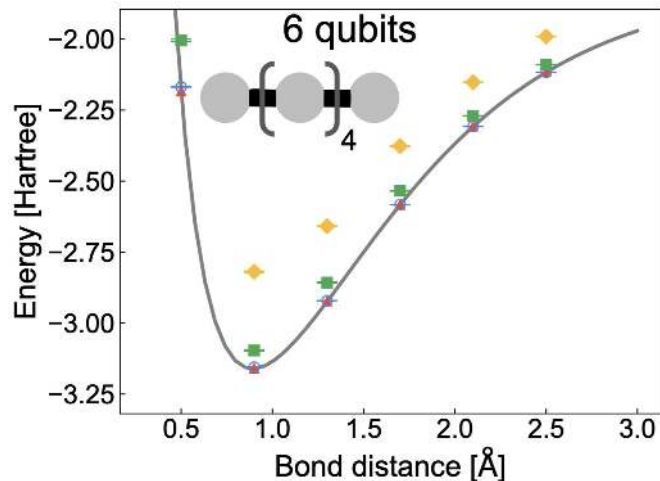
Sycamore Subgrid



$$\theta := e^{-i\theta Z/2}$$



# Hydrogen chain to benchmark out device



## Fidelity Witness

system	estimate	raw	+ps	+pure	+VQE
H <sub>6</sub>	0.571	0.674(2)	0.906(2)	0.9969(1)	0.99910(9)
H <sub>8</sub>	0.412	0.464(2)	0.827(2)	0.9879(3)	0.99911(8)
H <sub>10</sub>	0.277	0.316(2)	0.784(3)	0.9704(5)	0.9834(4)
H <sub>12</sub>	0.174	0.010(2)	0.654(3)	0.9424(9)	0.9913(3)

Supremacy  
Error model



# Optimization Problems

- Possibility of quantum enhanced optimization has driven interest in the field
- This group has a storied history with optimization problems!
- Every industry would benefit from improvements
- Optimization is really hard!

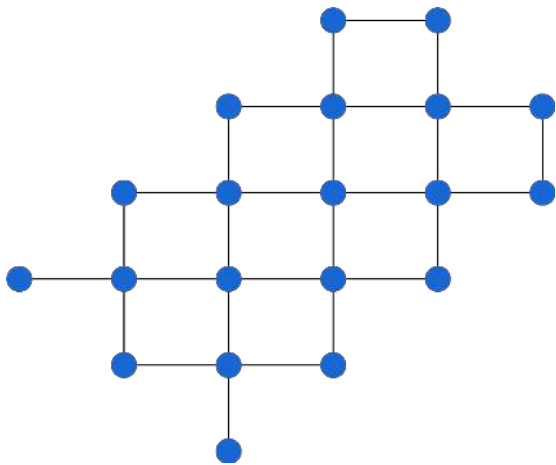


# Compiling complex cost functions

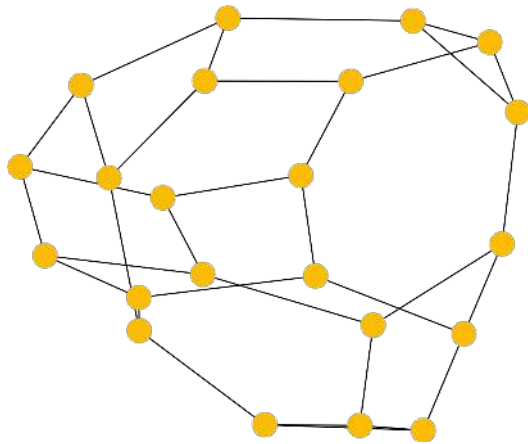
We can think of any 2-body  $C(x)$  as a graph

$$C = \sum_{i < j} w_{ij} Z_i Z_j$$

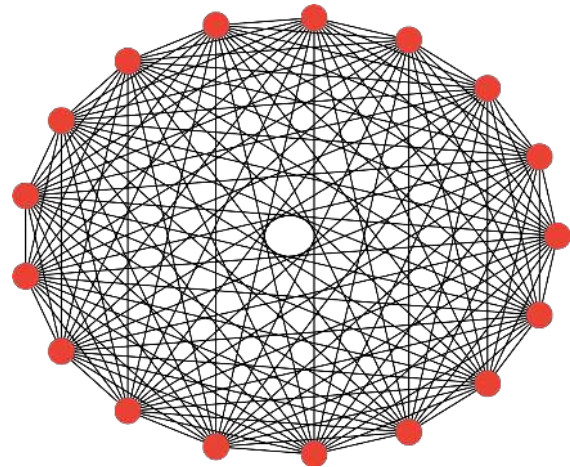
Hardware Grid



3-Regular MaxCut

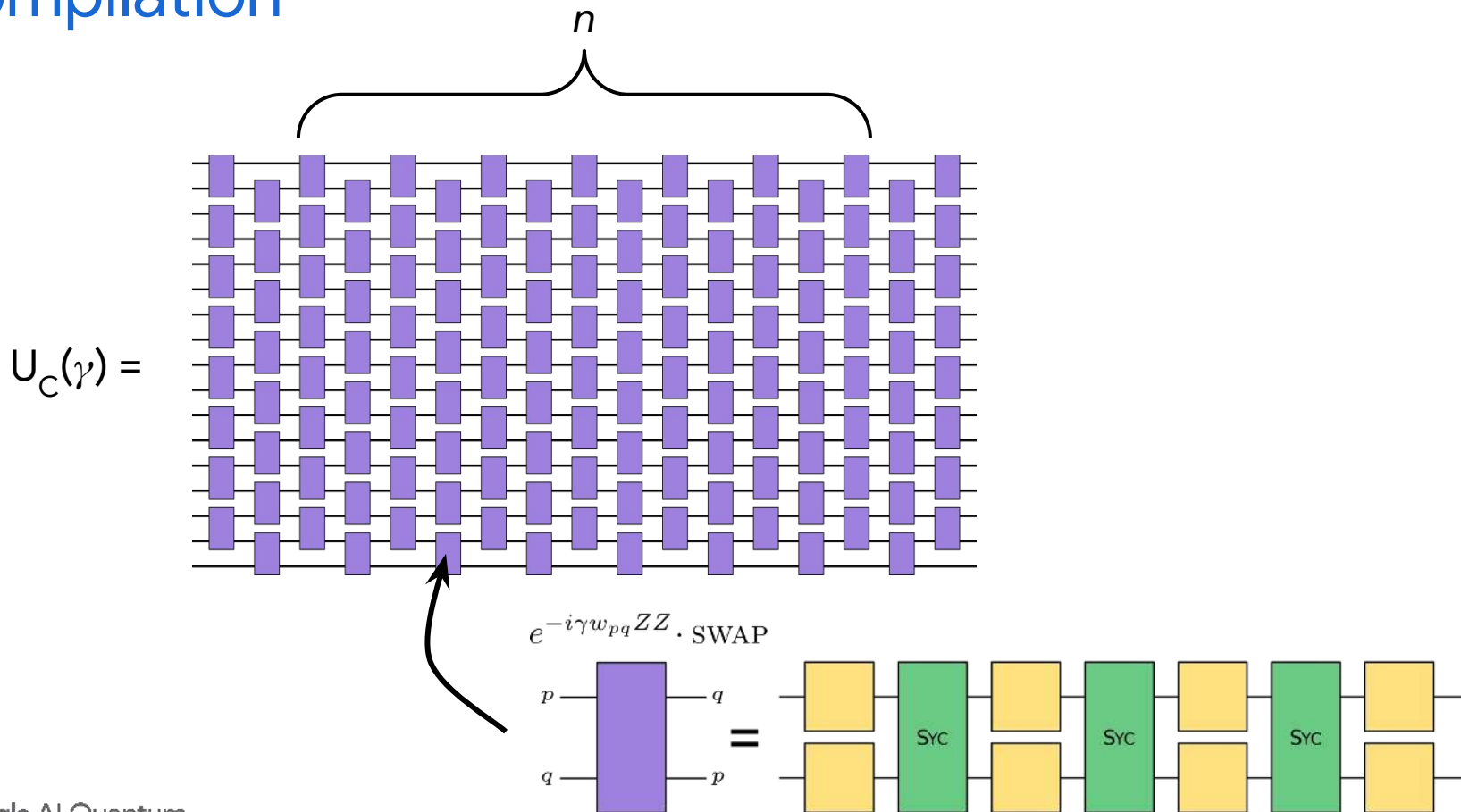


Sherrington-Kirkpatrick (SK) Model



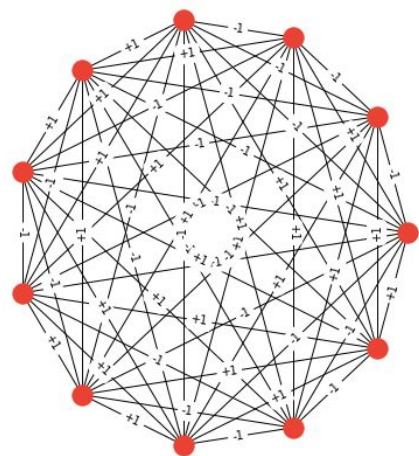


# Compilation

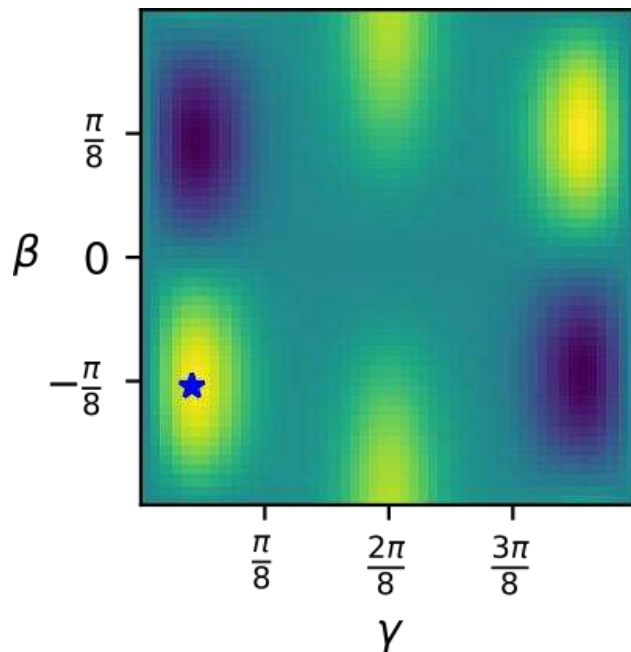


# Optimization

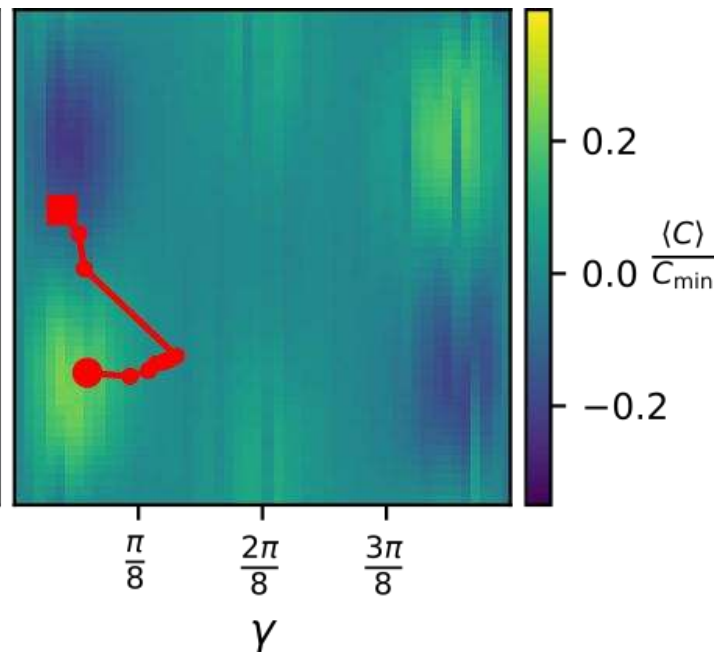
$$\langle C \rangle = \langle + | U_C^\dagger(\gamma) U_B^\dagger(\beta) C U_B(\beta) U_C(\gamma) | + \rangle$$



Noiseless Simulation



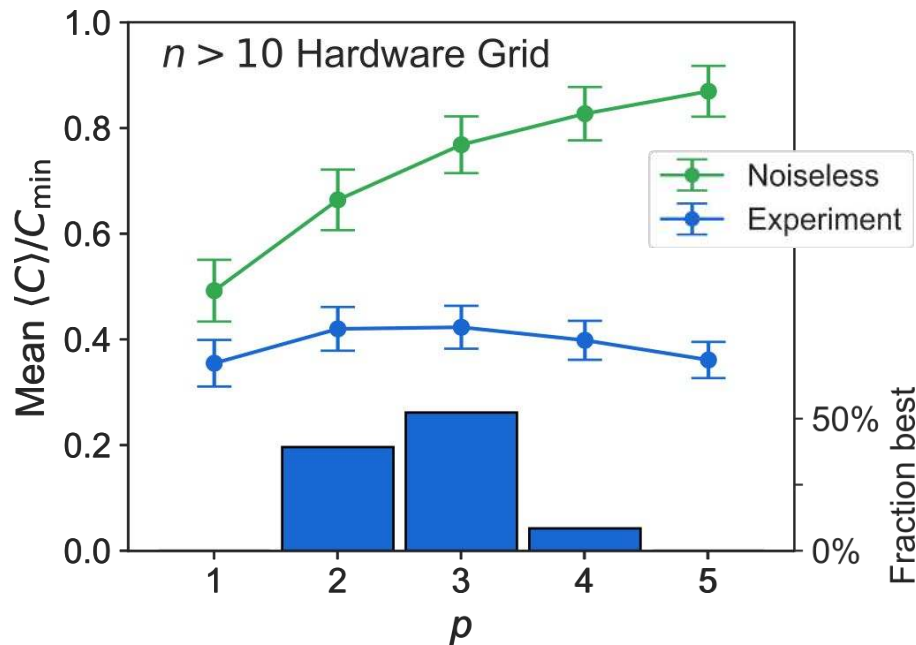
Experiment



SK model,  $n = 11$



# Scaling with Depth



- In the ideal noiseless case, increasing  $p$  increases performance
- With noise, there is a tradeoff
- Average performance peaks at  $p = 3$
- On a per-instance basis, most peak at  $p = 3$



# Conclusions

- Quantum applications have unique challenges but we are rapidly making progress
- We have reached a system size where classical simulation becomes increasingly challenging/expensive
- These large devices require new technology, and control techniques, characterization methods
- Sycamore processor has ushered in the NISQ era with a new focus on practical algorithms for near term devices



Thank you!

