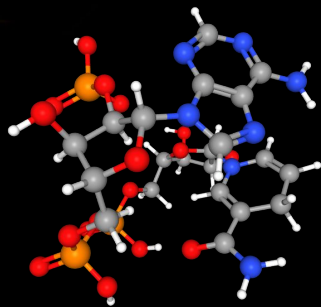




Google AI Quantum

Quantum chemistry on the
Sycamore quantum processor

Ryan Babbush
February 2020



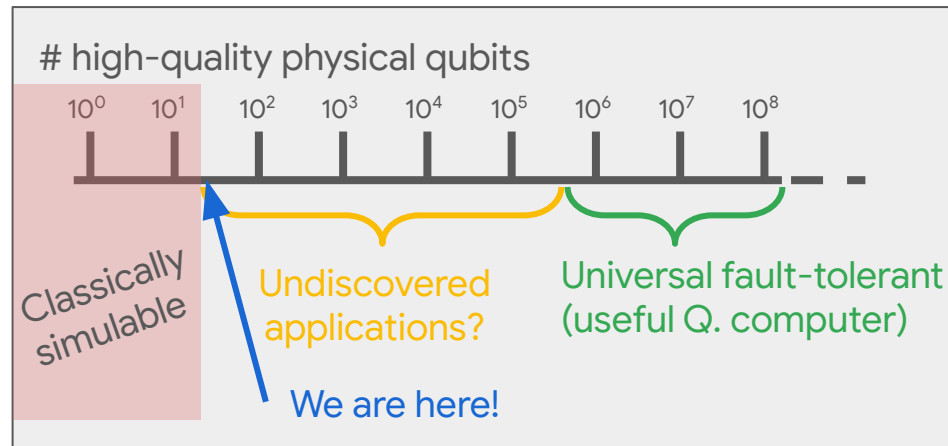
Quantum computers today

We are in the age of noisy intermediate scale (NISQ) quantum devices
We can run circuits on ~50 qubits but errors severely limit circuit size

Last year, Google team demonstrated “quantum supremacy”
i.e., we used our 54 qubit quantum computer to perform a well defined computational task that would be intractable on a classical computer

Ultimate goal is quantum error-correction
Has very large resource overheads

We’ll have NISQ devices in the meantime
Will we be able to use such devices to achieve quantum supremacy on a useful application?



The molecular electronic structure problem

Goal is to solve for the energy of molecule

$$H = \hat{T}_{\text{nuc}} + \hat{T}_{\text{elec}} + \hat{V}_{\text{nuc-nuc}} + \hat{V}_{\text{nuc-elec}} + \hat{V}_{\text{elec-elec}}$$

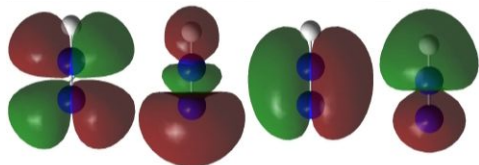
Energy surfaces allow us to understand reactions

Need chemical accuracy (1 kcal/mol) for rates

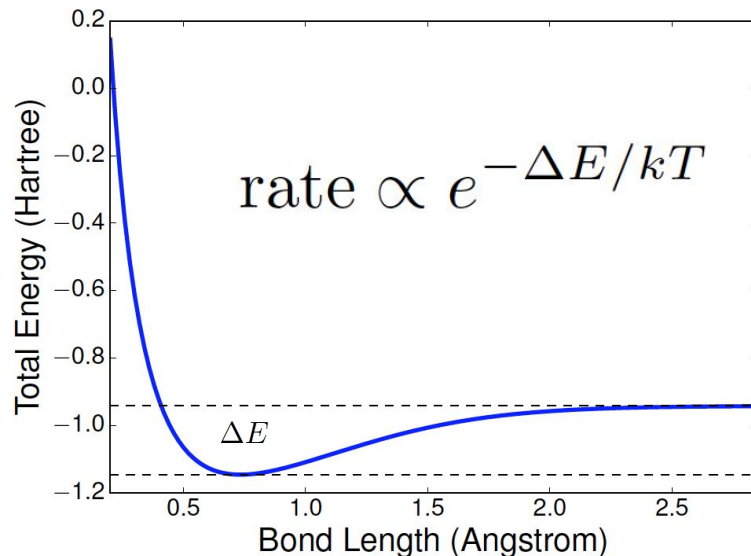
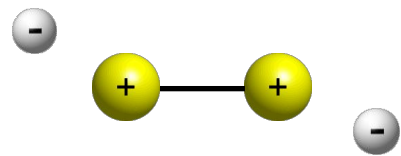
Such accuracy is often classically intractable

Especially for systems with strong correlation

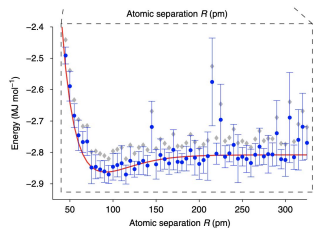
To represent wavefunctions on computer one must discretize space (confine to basis)



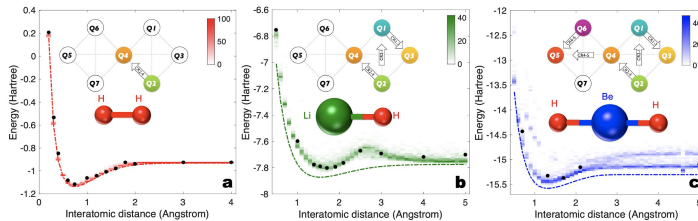
$$a_1 |0011\rangle + a_2 |0101\rangle + a_3 |1001\rangle + a_4 |0110\rangle + a_5 |1010\rangle + a_6 |1100\rangle$$



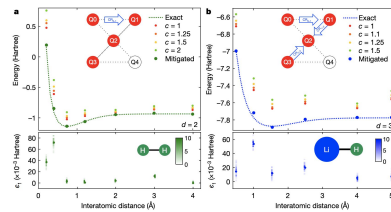
Everybody loves applying VQE to chemistry



O'Malley,
Babbush, et al. (2016)

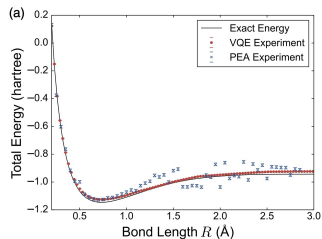


Hempel et al. (2018)



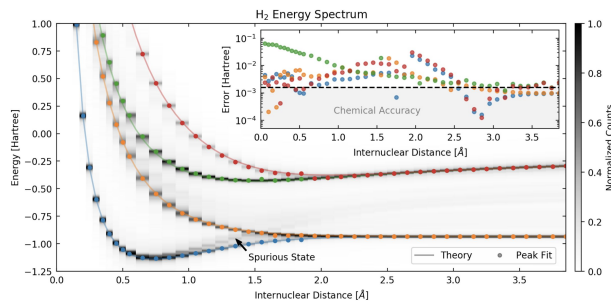
2014

Peruzzo,
McClean, et al. (2014)



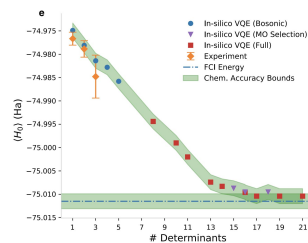
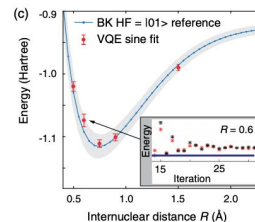
Kandala et al. (2017)

Colless et al. (2017)



Kandala et al. (2019),

Nam et al. (2019)

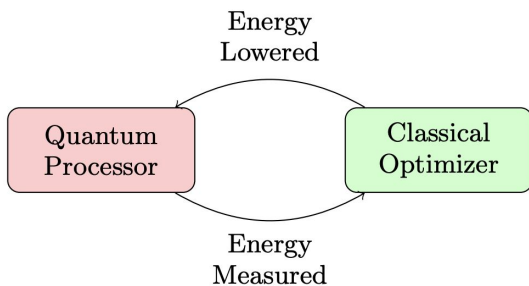


Present

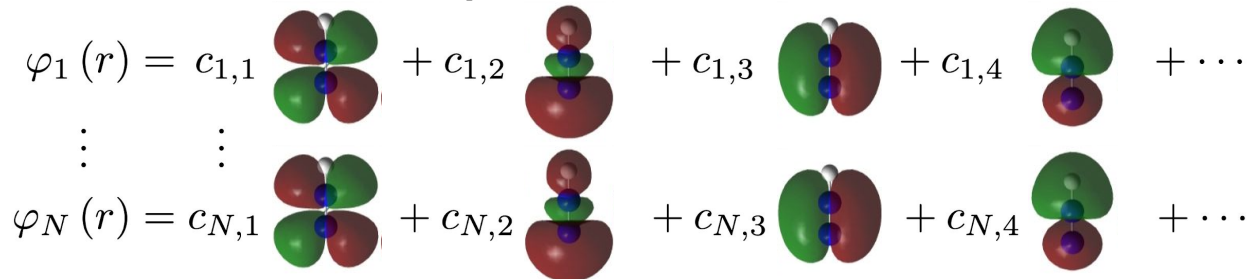
Why perform these experiments at all?

- WAY easier to publish in Nature than serious theory work (bad reason)
- Forces algorithmists to feel the pain of a real experiment!
- Provides a holistic device-level benchmark in the context of an actual algorithm
 - Where is our device relative to competitors?
 - Exactly how far are we really from something classically intractable?
- Study the effects of noise on algorithm / test error-mitigation ideas

Hartree-Fock on a quantum computer



Our ansatz corresponds to an orbital (basis) rotation

$$\begin{aligned} \varphi_1(\mathbf{r}) &= c_{1,1} \varphi_{1,1} + c_{1,2} \varphi_{1,2} + c_{1,3} \varphi_{1,3} + c_{1,4} \varphi_{1,4} + \dots \\ &\vdots \\ \varphi_N(\mathbf{r}) &= c_{N,1} \varphi_{N,1} + c_{N,2} \varphi_{N,2} + c_{N,3} \varphi_{N,3} + c_{N,4} \varphi_{N,4} + \dots \end{aligned}$$


simple circuit with linear depth complexity

$$|\psi(\kappa)\rangle = \exp \left[- \sum_{pq} \kappa_{pq} a_p^\dagger a_q \right] |\phi\rangle \quad c_{pq} = [\log \kappa]_{pq}$$

Optimizing over these parameters solves for the lowest energy mean-field wavefunction (i.e., Hartree-Fock)

$$\min_{\kappa} \langle \phi | \underbrace{U_{\kappa} H U_{\kappa}^\dagger}_{H(\kappa)} | \phi \rangle$$

it's classically tractable - so why do it?

- Basis rotations are a ubiquitous primitive!
 - Optimal compilation known
 - Great benchmark!
- Very entangled state with tractable structure
 - Allows us to better understand errors
 - Structure simplifies implementation

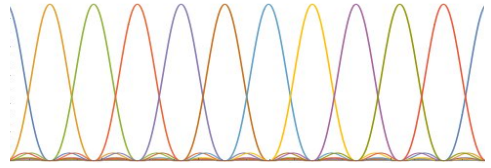
Why the obsession with basis rotations?

Using molecular orbitals leads to Hamiltonian with $O(N^4)$ terms



$$H = \sum_{pq} h_{pq} a_p^\dagger a_q + \sum_{pqrs} h_{pqrs} a_p^\dagger a_q^\dagger a_r a_s$$

By changing the basis, we obtain Hamiltonian with $O(N^2)$ terms - PRX 8, 011044 (2018)



$$H = \sum_{pq} V_{pq} n_p n_q + \underbrace{\sum_{pq} T_{pq} a_p^\dagger a_q}_{U(\sum_p \tau_p n_p)U^\dagger} \quad n_p = a_p^\dagger a_p$$

Or we can factorize Hamiltonian into $L = O(N)$ different bases - arXiv:1812.00954

$$H = U_0 \left(\sum_p g_p n_p \right) U_0^\dagger + \sum_{\ell=1}^L U_\ell \left(\sum_{pq} g_{pq}^{(\ell)} n_p n_q \right) U_\ell^\dagger$$

This form also helpful for estimating $\langle H \rangle$ while mitigating errors - arXiv:1907.13117

Optimal synthesis of basis rotation circuit

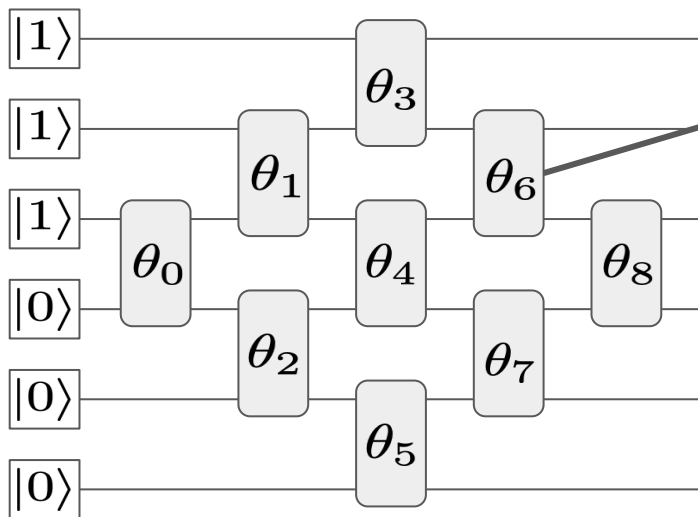
Physical Review Letters 120 (11), 110501 (2018)

$$|\psi(\vec{\kappa})\rangle = \exp \left[- \sum_{pq} \kappa_{pq} a_p^\dagger a_q \right] |\phi\rangle$$

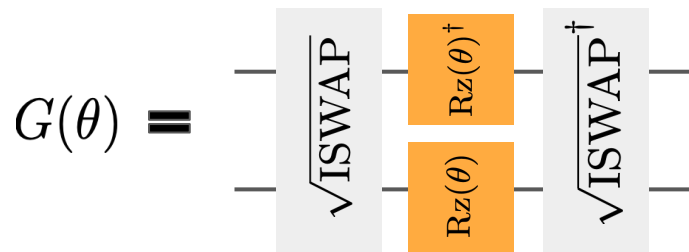
Optimal synthesis of basis rotation circuit

Physical Review Letters 120 (11), 110501 (2018)

$$|\psi(\vec{\kappa})\rangle = \exp \left[- \sum_{pq} \kappa_{pq} a_p^\dagger a_q \right] |\phi\rangle$$



$$G(\theta) = \begin{pmatrix} 1 & 0 & 0 & 0 \\ 0 & \cos(\frac{\theta}{2}) & -\sin(\frac{\theta}{2}) & 0 \\ 0 & \sin(\frac{\theta}{2}) & \cos(\frac{\theta}{2}) & 0 \\ 0 & 0 & 0 & 1 \end{pmatrix}$$



Exploiting RDM structure for fewer errors / measurements

Simple energy evaluation and error-mitigation from Reduced Density Matrices (RDMs)

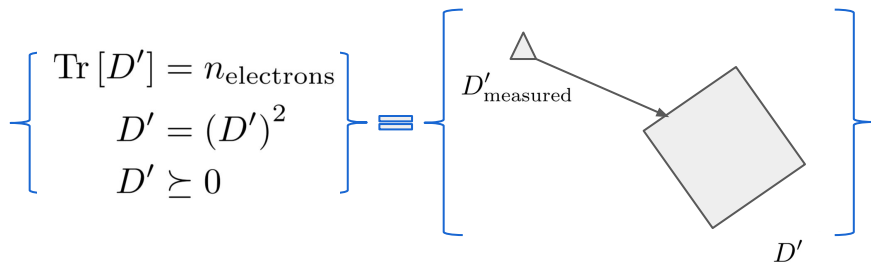
$$\langle H \rangle = \sum_{pq} h_{pq} \underbrace{\langle a_p^\dagger a_q \rangle}_{D'_{pq}} + \frac{1}{2} \sum_{pqrs} h_{pqrs} \underbrace{\langle a_p^\dagger a_q^\dagger a_r a_s \rangle}_{D''_{pqrs}}$$

$$D''_{pqrs} = \frac{1}{2} (D'_{ps} D'_{qr} - D'_{qs} D'_{pr})$$

Even general 2-RDMs have nontrivial structure which we can leverage for error-mitigation

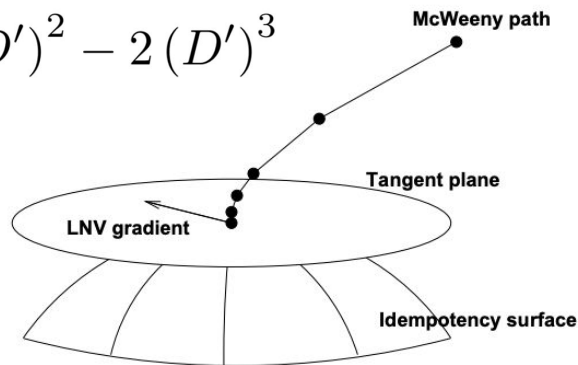
New Journal of Physics 20 (5), 053020 (2018)

Hartree-Fock RDMs have known geometry



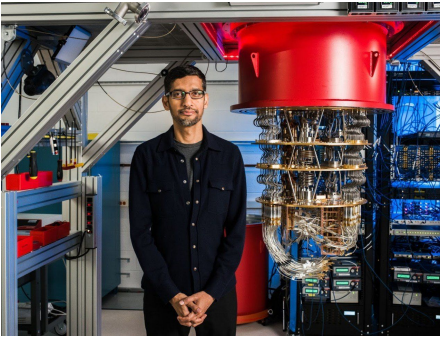
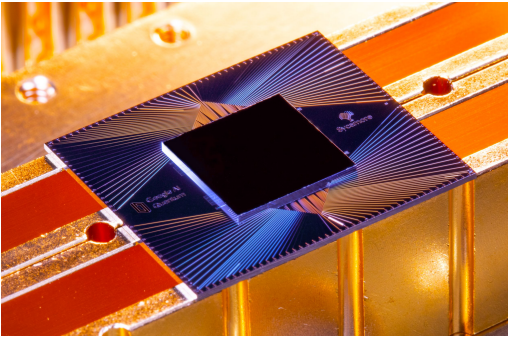
Idempotency by engineered fixed points

$$D' = 3 (D')^2 - 2 (D')^3$$



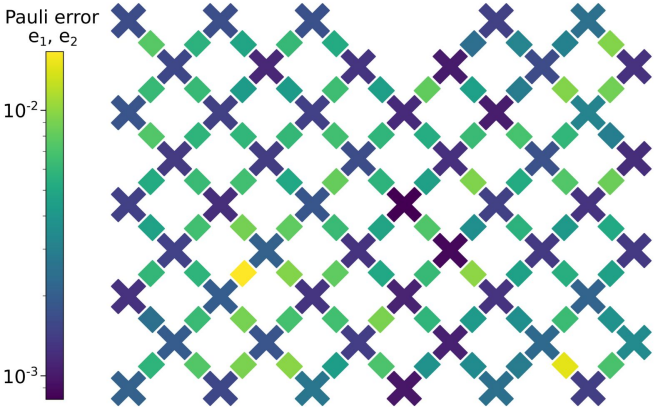
Google Sycamore superconducting qubit platform

Sycamore platform has 54 planar transmon qubits tunably coupled in square lattice array



Pauli and measurement errors

Average error	Isolated	Simultaneous
Single-qubit (e_1)	0.15%	0.16%
Two-qubit (e_2)	0.36%	0.62%
Two-qubit, cycle (e_{2c})	0.65%	0.93%
Readout (e_r)	3.1%	3.8%



We collected *most* data through cloud interface



Cirq

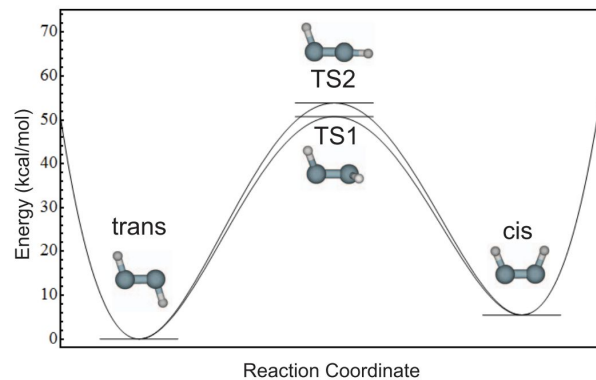
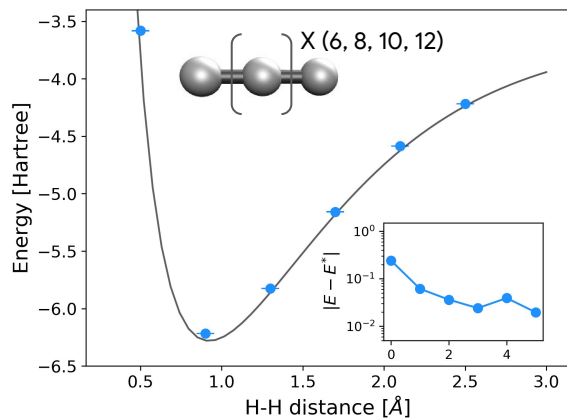


OpenFermion

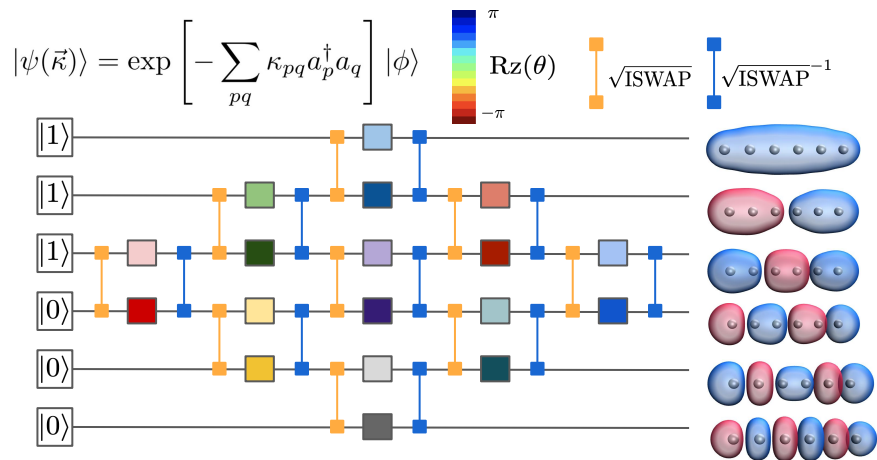


Google AI
Quantum

So how well does the machine do?



Hydrogen chain to benchmark out device

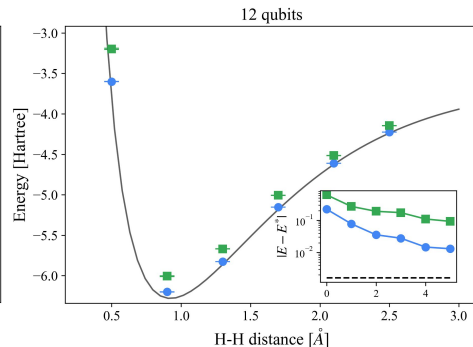
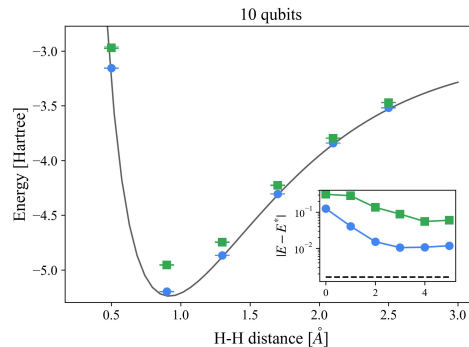
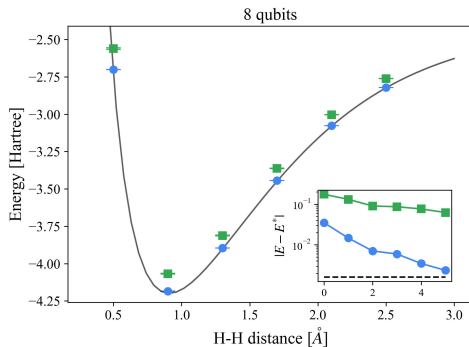
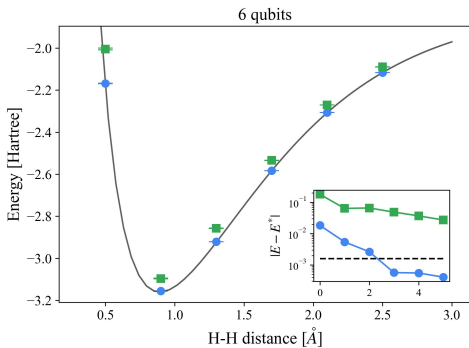


18 sqrt(iswap), 27 Rz

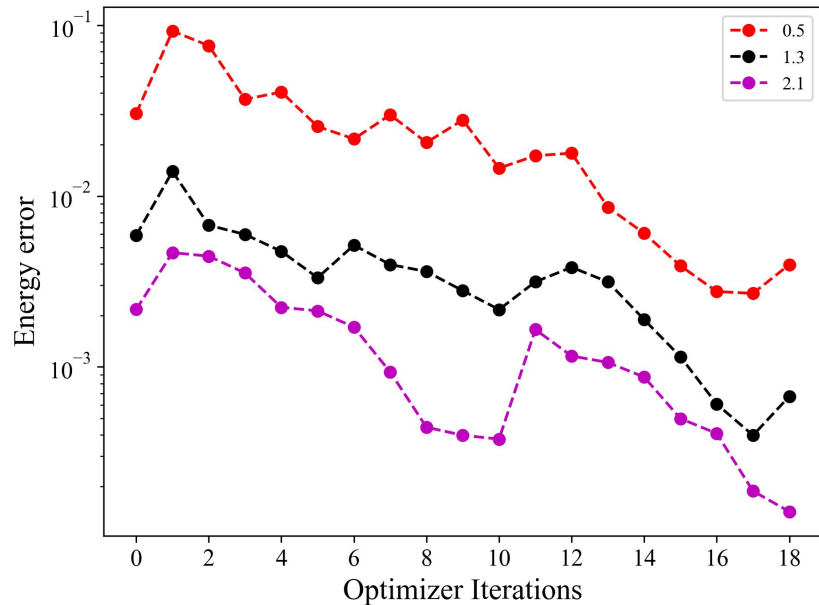
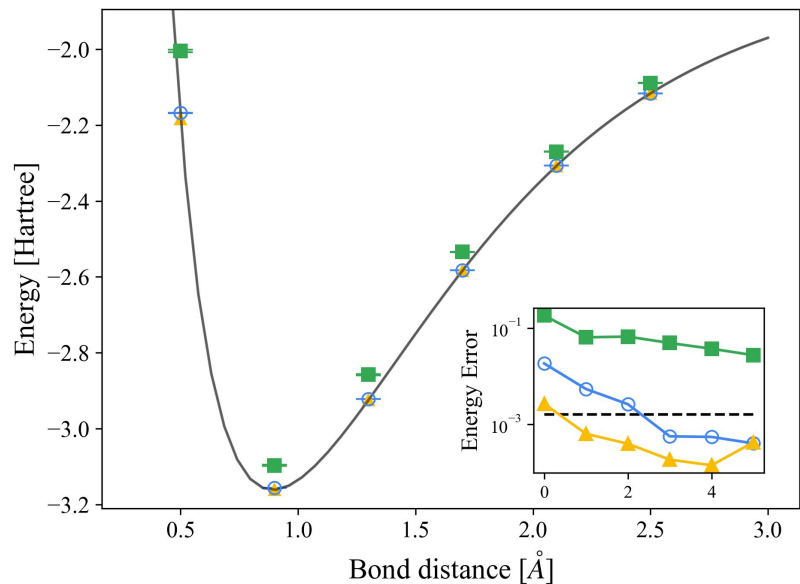
32 sqrt(iswap), 48 Rz

50 sqrt(iswap), 60 Rz

72 sqrt(iswap), 108 Rz

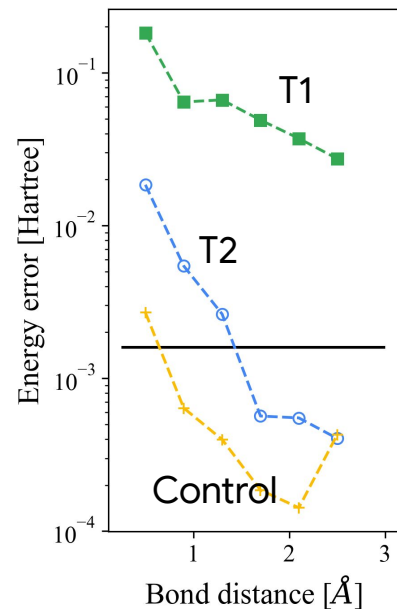
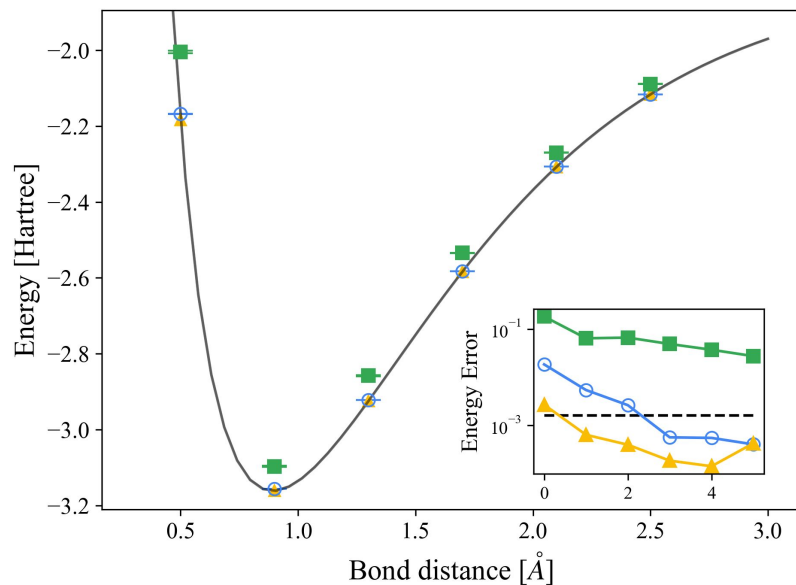


Hydrogen chain to benchmark out device



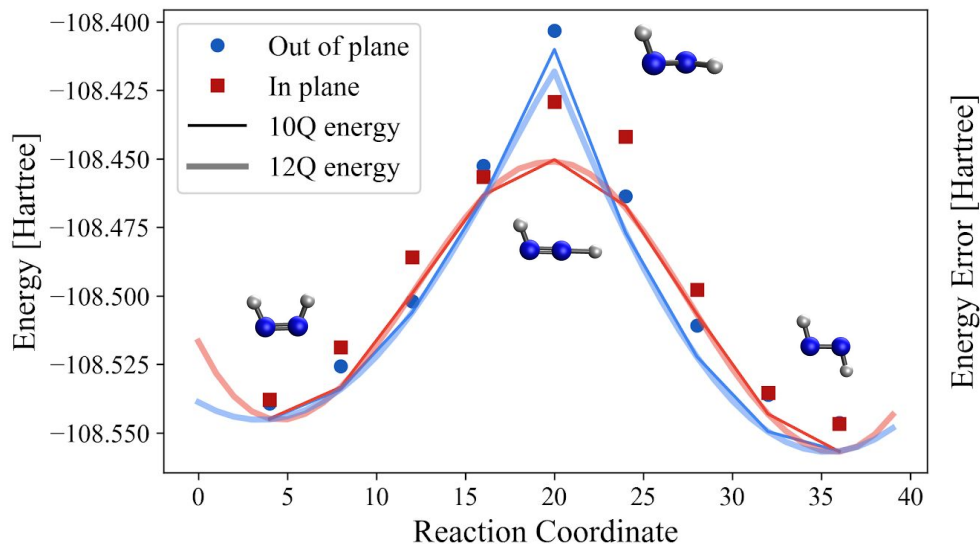
Used fact that gradient is function of 1-RDM

Hydrogen chain to benchmark out device



Starting to think about doing real chemistry

10 qubits, 0.050 [Hartree] separation between TS1 and TS2
Can we resolve this on Sycamore?



So what did we do / learn?

We realized the largest NISQ chemistry experiment by far

Good results up to 12 qubits but seems unlikely to scale past ~20 qubits with current error rates

Ansatz corresponded to arbitrary free fermion evolution (Hartree-Fock when optimized)

This is a classically tractable ansatz but still has a lot of entanglement and other nice properties

Algorithm performance improved a lot due to error-mitigation

Post-selection (T1), purification (T2), variational feedback (coherent errors)

Still, breakthrough might be required to scale to classically intractable regime

Or perhaps we “just” need error-correction!



Thank you!

Nick Rubin (led experiment)

Charles Neil (ran experiment)

Zhang Jiang (calibration / control)

Vadim Smelyanskiy (calibration / control)



Appendix Follows

Circuits for one-body rotations: Symmetries

Unrestricted spin [GHF]

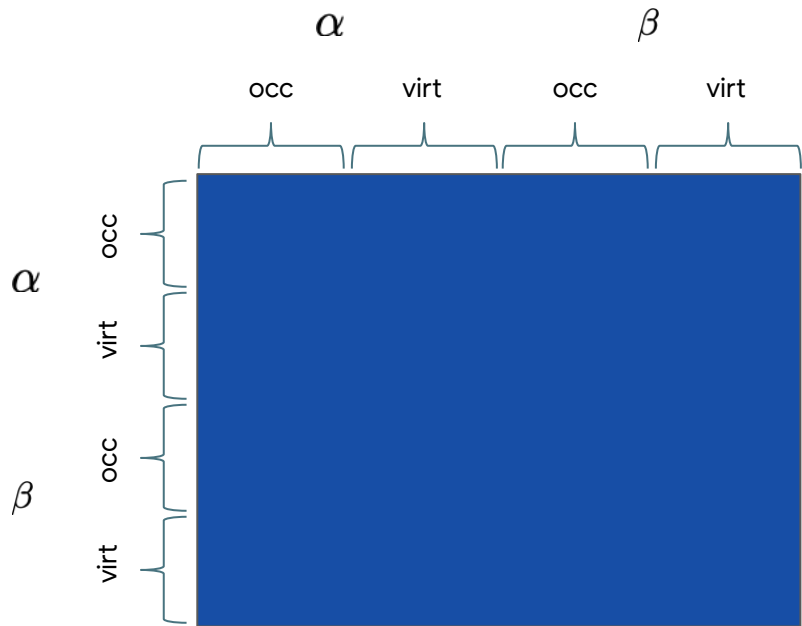
$$\begin{aligned}
 |\Phi\rangle &= e^K a_1^\dagger e^{-K} \dots e^K a_n^\dagger e^{-K} |0\rangle \\
 &= e^K a_1^\dagger \dots a_n^\dagger |0\rangle
 \end{aligned}$$

$$\begin{aligned}
 K &= \sum_{pq} \kappa_{p,q} a_p^\dagger a_q \\
 K &= -K^\dagger
 \end{aligned}$$

Restricted spin [UHF/RHF]

$$K_{\text{UHF}} = \sum_{p>q} \kappa_{p,q}^\alpha (a_{p\alpha}^\dagger a_{q\alpha} - a_{q\alpha}^\dagger a_{p\alpha}) + \sum_{p>q} \kappa_{p,q}^\beta (a_{p\beta}^\dagger a_{q\beta} - a_{q\beta}^\dagger a_{p\beta})$$

$$K_{\text{RHF}} = \sum_{p>q} \kappa_{p,q} (a_{p\alpha}^\dagger a_{q\alpha} + a_{p\beta}^\dagger a_{q\beta} - a_{q\alpha}^\dagger a_{p\alpha} - a_{q\beta}^\dagger a_{p\beta})$$



Circuits for one-body rotations: Symmetries

Unrestricted spin [GHF]

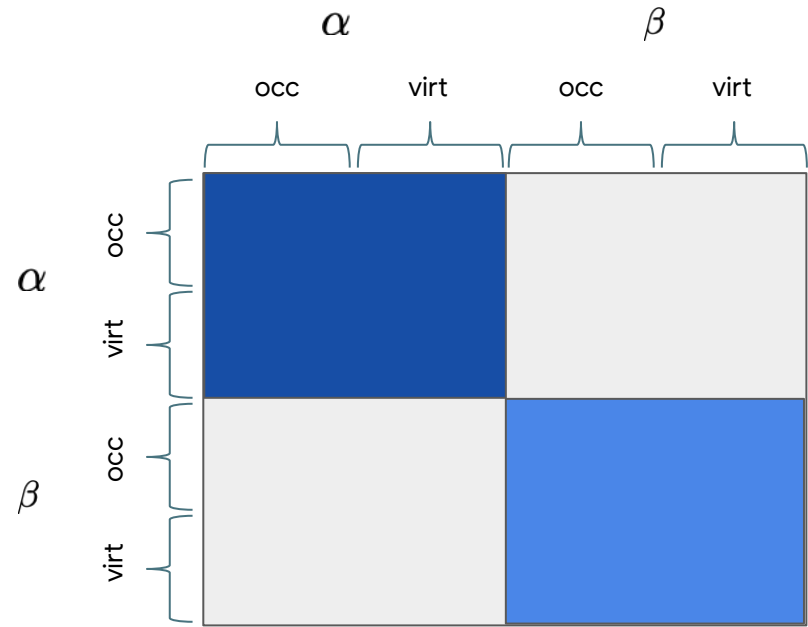
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Circuits for one-body rotations: Symmetries

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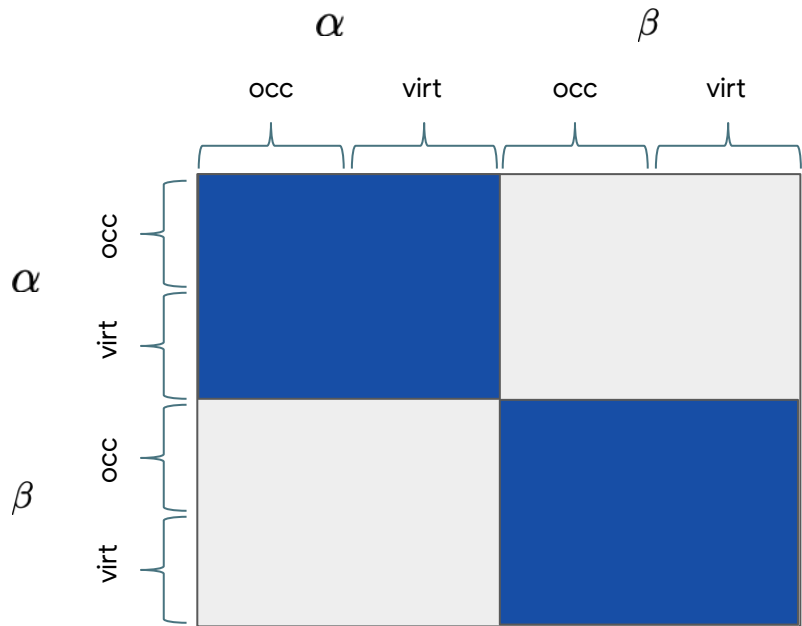
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Circuits for one-body rotations: Symmetries

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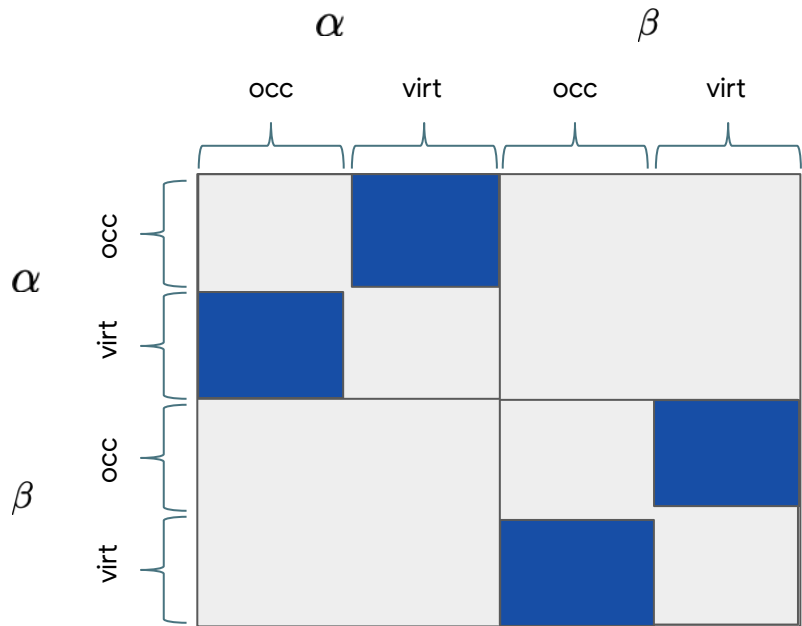
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Additional restriction due to removal of redundant rotations



Measurements?

For product state energy can be evaluated by measuring all pairwise correlators

$${}^2D_{ij}^{pq} = \langle \phi(\theta) | a_p^\dagger a_q^\dagger a_j a_i | \phi(\theta) \rangle = \frac{1}{2} ({}^1D_i^{p1} D_j^q - {}^1D_i^{q1} D_j^p)$$

$$\langle \hat{H} \rangle = \sum_{ij} h_{ij} \langle \hat{a}_i^\dagger \hat{a}_j \rangle + \sum_{ijkl} V_{ijkl} \langle \hat{a}_i^\dagger \hat{a}_j^\dagger \hat{a}_l \hat{a}_k \rangle$$

$$\langle \hat{H} \rangle = \sum_{ij} h_{ij} {}^1D_j^i + \sum_{ijkl} V_{ijkl} {}^2D_{lk}^{ij}$$

Measurements?

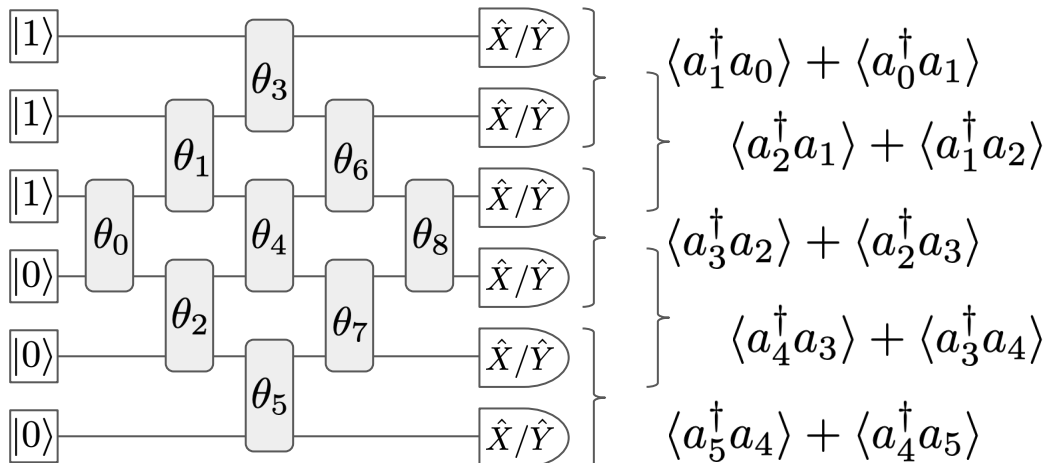
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Goal: measure the 1-RDM: $\langle \psi | a_i^\dagger a_j | \psi \rangle$



Measurements?

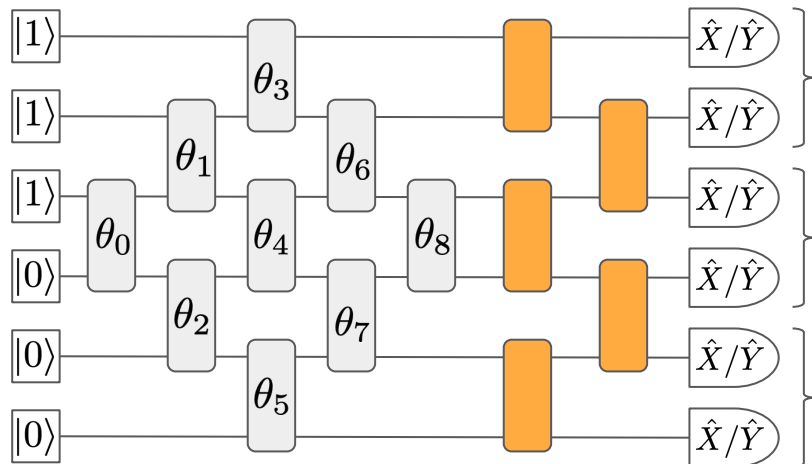
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$$\langle \hat{H} \rangle = \sum_{ij} h_{ij} {}^1D_j^i + \sum_{ijkl} V_{ijkl} {}^2D_{lk}^{ij}$$

Goal: measure the 1-RDM: $\langle \psi | a_i^\dagger a_j | \psi \rangle$



$$\left. \begin{aligned} &\langle a_3^\dagger a_1 \rangle + \langle a_1^\dagger a_3 \rangle \\ &\langle a_0^\dagger a_3 \rangle + \langle a_3^\dagger a_0 \rangle \\ &\langle a_5^\dagger a_0 \rangle + \langle a_0^\dagger a_5 \rangle \\ &\langle a_2^\dagger a_5 \rangle + \langle a_5^\dagger a_2 \rangle \\ &\langle a_4^\dagger a_2 \rangle + \langle a_2^\dagger a_4 \rangle \end{aligned} \right\}$$



$$= \exp(-i\pi \text{fswap}/2)$$

$$\begin{aligned} \text{fswap} &= a_p^\dagger a_q + a_q^\dagger a_p \\ &\quad - a_p^\dagger a_p - a_q^\dagger a_q \end{aligned}$$

Measurements?

For product state energy can be evaluated by measuring all pairwise correlators

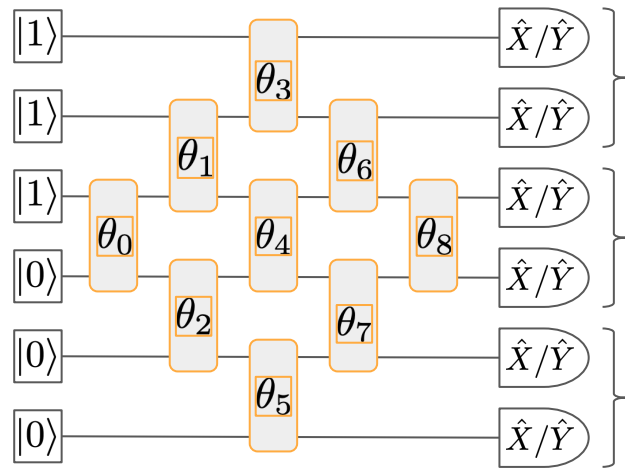
$${}^2D_{ij}^{pq} = \langle \phi(\theta) | a_p^\dagger a_q^\dagger a_j a_i | \phi(\theta) \rangle = \frac{1}{2} ({}^1D_i^{p1} D_j^q - {}^1D_i^{q1} D_j^p)$$

$$\langle \hat{H} \rangle = \sum_{ij} h_{ij} \langle \hat{a}_i^\dagger \hat{a}_j \rangle + \sum_{ijkl} V_{ijkl} \langle \hat{a}_i^\dagger \hat{a}_j^\dagger \hat{a}_l \hat{a}_k \rangle$$

$$\langle \hat{H} \rangle = \sum_{ij} h_{ij} {}^1D_j^i + \sum_{ijkl} V_{ijkl} {}^2D_{lk}^{ij}$$

Goal: measure the 1-RDM: $\langle \psi | a_i^\dagger a_j | \psi \rangle$

$$U(u_a) \cdot U(u_b) = U(u_a \cdot u_b)$$



$$\left. \begin{aligned} &\langle a_3^\dagger a_1 \rangle + \langle a_1^\dagger a_3 \rangle \\ &\langle a_0^\dagger a_3 \rangle + \langle a_3^\dagger a_0 \rangle \\ &\langle a_5^\dagger a_0 \rangle + \langle a_0^\dagger a_5 \rangle \\ &\langle a_2^\dagger a_5 \rangle + \langle a_5^\dagger a_2 \rangle \\ &\langle a_4^\dagger a_2 \rangle + \langle a_2^\dagger a_4 \rangle \end{aligned} \right\}$$

Measurements?

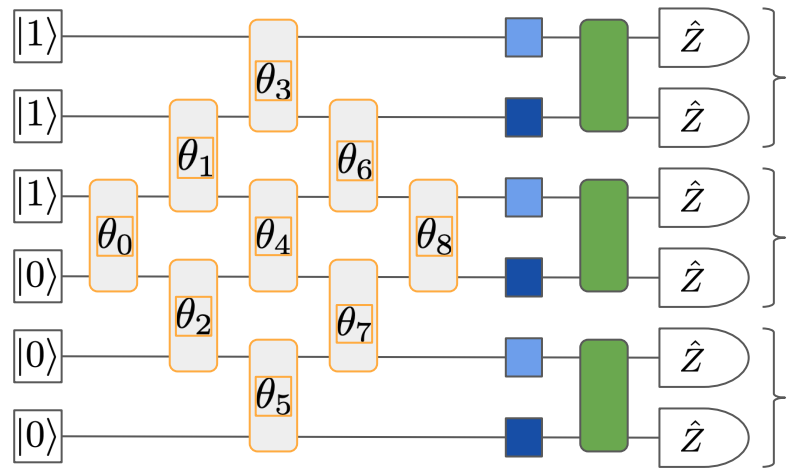
For product state energy can be evaluated by measuring all pairwise correlators

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Goal: measure the 1-RDM: $\langle \psi | a_i^\dagger a_j | \psi \rangle$



$$\langle a_3^\dagger a_1 \rangle + \langle a_1^\dagger a_3 \rangle$$

$$\langle a_0^\dagger a_3 \rangle + \langle a_3^\dagger a_0 \rangle$$

$$\langle a_5^\dagger a_0 \rangle + \langle a_0^\dagger a_5 \rangle$$

$$\langle a_2^\dagger a_5 \rangle + \langle a_5^\dagger a_2 \rangle$$

$$\langle a_4^\dagger a_2 \rangle + \langle a_2^\dagger a_4 \rangle$$

$$U(u_a) \cdot U(u_b) = U(u_a \cdot u_b)$$