

# Unbiasing Fermionic Quantum Monte Carlo with a Quantum Computer

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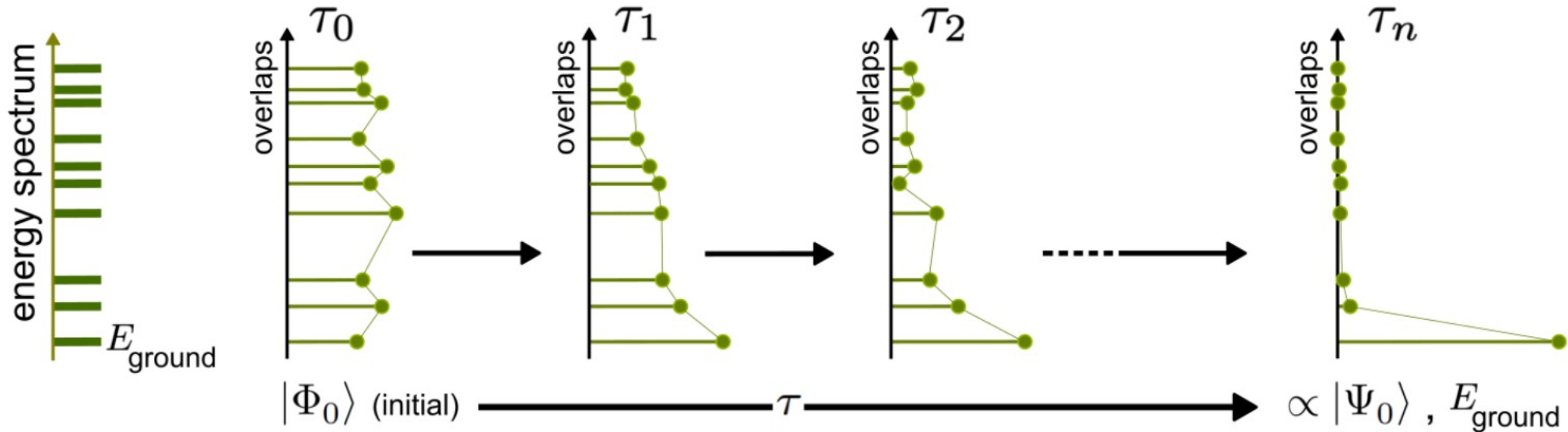
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- As imaginary time progresses, the energy of the current wavefunction should tend towards the ground state energy of  $H$ .

# Imaginary Time Evolution

**a** imaginary time evolution

$$\lim_{\tau \rightarrow \infty} e^{-\tau \hat{H}} |\Phi_0\rangle \propto |\Psi_0\rangle$$



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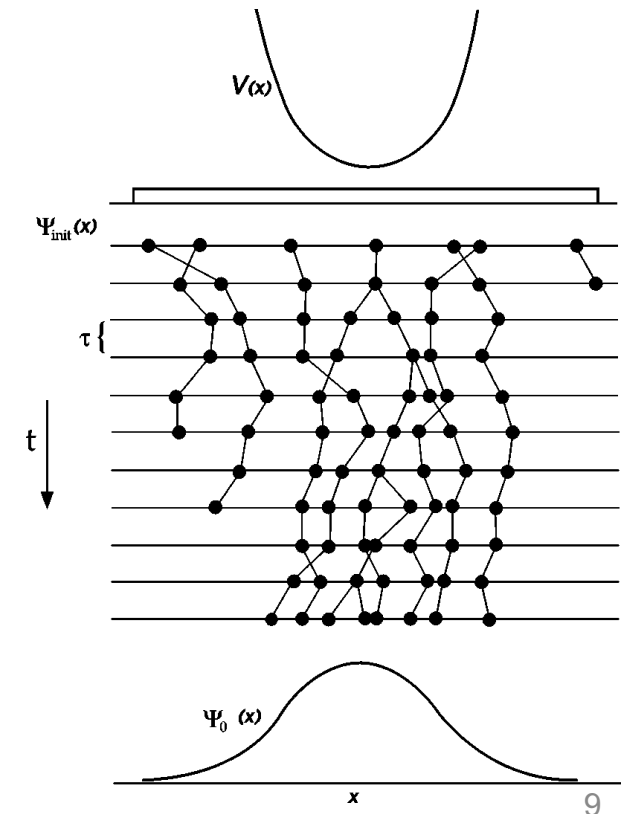
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- Inside the summation, these are the Boltzmann weights,  $w(i) = e^{-\beta E_i}$ , (which classically are positive or zero)

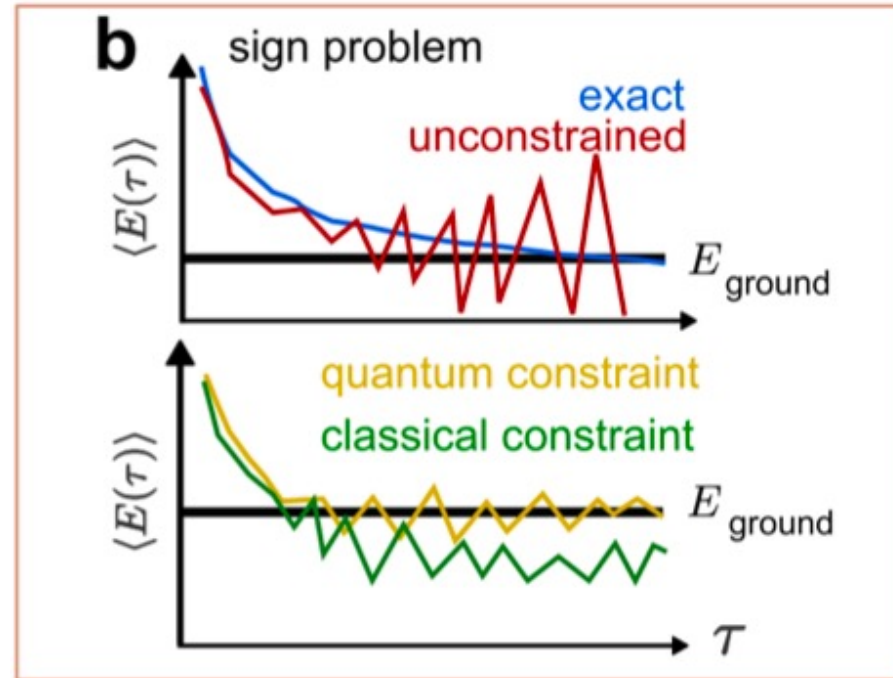
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- Combinations of positive and negative Boltzmann weights yield exponential growth in the statistical errors (proof is omitted for brevity)

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- In this paper, the “fixed node” approximation is one constraint used (delete any negative weights)

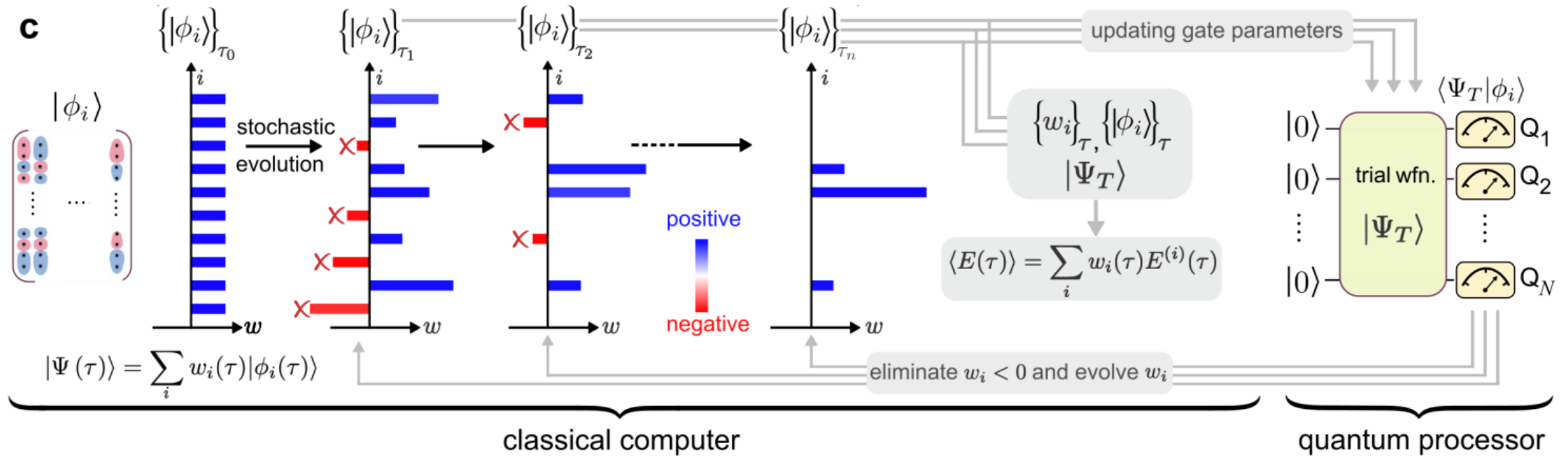
# Quantum-Classical Hybrid AFQMC Algorithm (QC-AFQMC)

- The energy in AFQMC is given by  $E(\tau) = \frac{\langle \Psi_T | \hat{H} | \Psi(\tau) \rangle}{\langle \Psi_T | \Psi(\tau) \rangle}$ .
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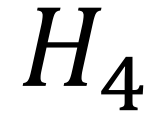
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- We need to calculate  $\langle \Phi_T | \phi_i(\tau) \rangle$  for each walker and every timestep
- This is inefficient on a classical computer, but efficient on a quantum computer
- How can we utilize both the classical and quantum processors to maximize the efficiency?

# QC-AFQMC Overview



# Results

- Experiments were performed using Google's 54 qubit processor *Sycamore*
- We are interested in the atomization energy of the following molecules:
  - $H_4$
  - $N_2$
  - Diamond



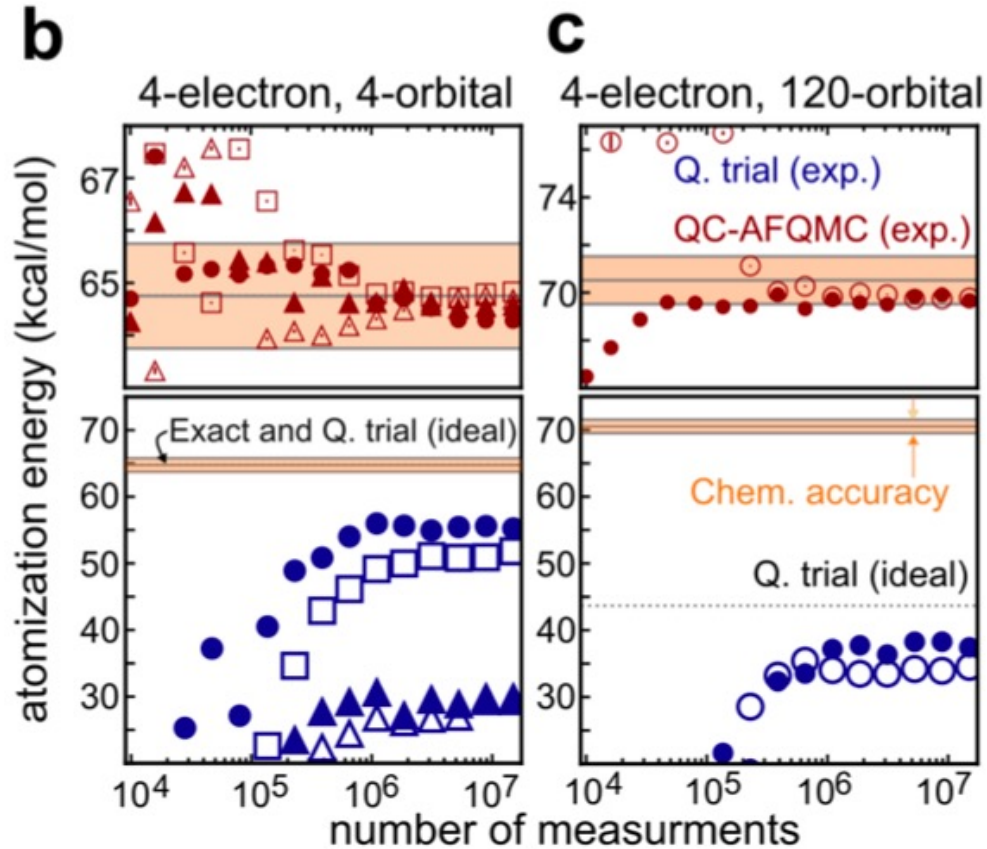
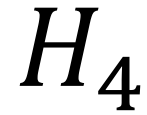
- We start with a square geometry



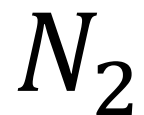
	Exact	AFQMC	QC-AFQMC
4 Orbital	64.7	62.9	64.3
120 Orbital	70.5	68.6	69.7


Atomization Energy of  $H_4$  (kcal/mol)

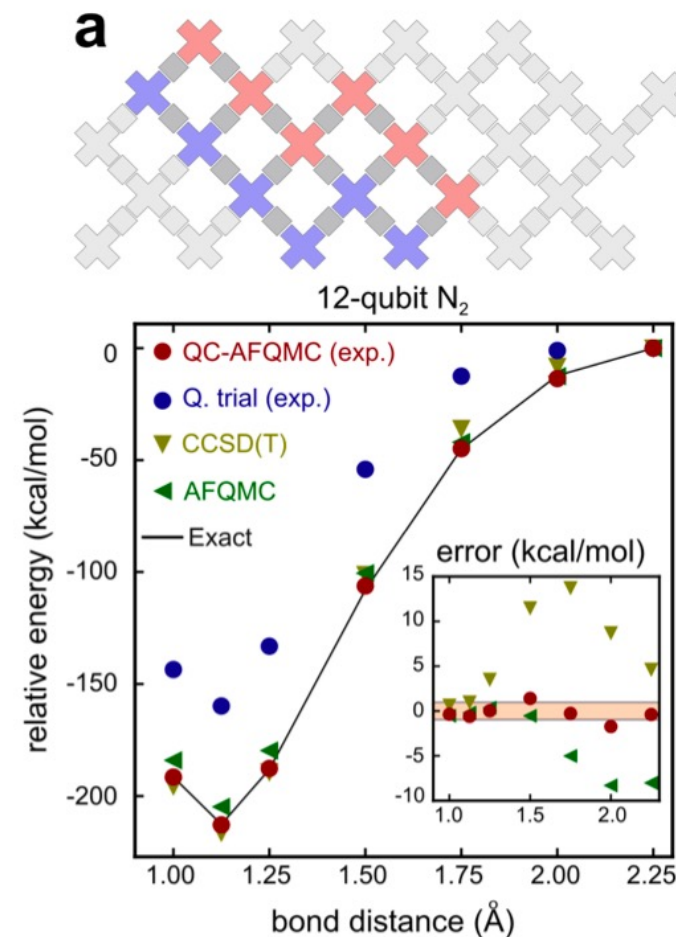




- Each style of dot represents a different run
- For both basis sets, QC-AFQMC converges on the order of  $10^7$  measurements
- For the 120-orbital basis set, QC-AFQMC converges even quicker

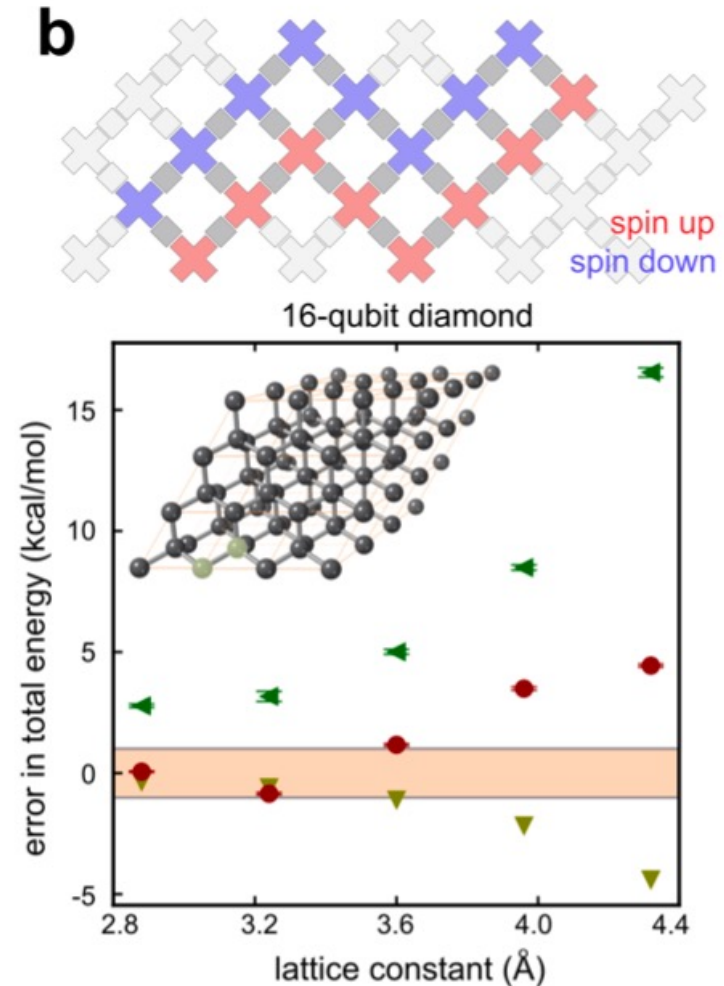


- In this experience, 12 qubits are used
- We use a linear geometry:  

- Again, QC-AFQMC gives closest results (however, not within chem. Accuracy 1kcal/mol)
- Takeaway: Even with a simple trial wavefunction, our energies are close to those from state-of-the-art tech.



# Diamond

- In this experiment, the lattice constant of diamond is being discovered with 16 qubits
- At this size, the model exhibits significant finite-size effects
- Correct experimental lattice constant not predicted
- This is the largest-to-date simulation quantum computer (as of July 2021)
- QC-AFQMC is as accurate as state-of-the-art method for a range of lattice constants



# Source

- “Unbiasing Fermionic Monte Carlo with a Quantum Computer”
  - <https://arxiv.org/pdf/2106.16235.pdf>