



# Hybrid classical/quantum algorithms

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# Variational Quantum Eigensolver (VQE)

- VQE was the first variational algorithm

*Problem:*

Find the ground energy of a  
Hamiltonian that describes a molecule  
or solid state system

- Solution: use variational principle on QC

# Variational principle

- Hamiltonian  $H$  describes the electronic structure of a molecule or solid state system
- Find a trial state  $|\Psi(\theta)\rangle$  with parameters  $\theta$  and compute  $\langle H \rangle$
- Vary parameters  $\theta$  to find the lowest value of  $\langle H \rangle$

$$E_0 \leq \langle \Psi(\theta) | H | \Psi(\theta) \rangle \equiv \langle H \rangle$$

# Variational principle

- It is extremely powerful and easy to use
- Even if  $|\Psi(\theta)\rangle$  has no relation to the actual ground state, one often gets accurate values for the ground state  $E_0$
- Disadvantage: we never know how close we are to the target value — only know that we have upper bound

Parameter update  $\theta \longrightarrow \theta'$

Quantum state preparation  $|\Psi_0\rangle$

Ansatz

$$U(\theta)|\Psi_0\rangle \\ \equiv \\ |\Psi(\theta)\rangle$$

Measurement  $H$

Quantum

Average

Optimize

$$\theta, E(\theta)$$

Classical

# Electronic structure

- Molecule characterized by Hamiltonian

$$H_{\text{mol}} = H_{\text{nucI}} + H_e$$

- Only interested in the electronic structure

$$H_e = - \sum_i \frac{\nabla_i^2}{2} - \sum_{i,I} \frac{Z_I}{|\mathbf{r}_i - \mathbf{R}_I|} + \frac{1}{2} \sum_{i \neq j} \frac{1}{|\mathbf{r}_i - \mathbf{r}_j|}$$

electron kinetic

electron-nucleus

electron-electron

# Electronic structure

- Express in second quantization

$$H = \sum_{p,q} h_{p,q} a_p^\dagger a_q + \frac{1}{2} \sum_{p,q,r,s} a_p^\dagger a_q^\dagger a_r a_s$$

- $h_{p,q}$  kinetic energy of electrons and Coulomb interaction with nuclei
- $h_{p,q,r,s}$  electron-electron Coulomb repulsion

# Map Hamiltonian to quantum computer

- Map **fermionic** Hamiltonian to **qubit** Hamiltonian

$$H = \sum_{p,q} h_{p,q} a_p^\dagger a_q + \frac{1}{2} \sum_{p,q,r,s} a_p^\dagger a_q^\dagger a_r a_s$$



$$H = \sum_j h_j \Pi \sigma_i^j$$



# Map Hamiltonian to quantum computer

- Qubit Hamiltonian: sum of Pauli strings
- Example: 4 qubit Hamiltonian for  $H_2$

$$\begin{aligned} H = & h_0 I + h_1 Z_0 + h_2 Z_1 + h_3 Z_2 + h_4 Z_3 \\ & + h_5 Z_0 Z_1 + h_6 Z_0 Z_2 + h_7 Z_1 Z_2 + h_8 Z_0 Z_3 + h_9 Z_1 Z_3 \\ & + h_{10} Z_2 Z_3 + h_{11} Y_0 Y_1 X_2 X_3 + h_{12} X_0 Y_1 Y_2 X_3 \\ & + h_{13} Y_0 X_1 X_2 Y_3 + h_{14} X_0 X_1 Y_2 Y_3 \end{aligned}$$

Parameter update  $\theta \longrightarrow \theta'$

Quantum state preparation  $|\Psi_0\rangle$

Ansatz

$$U(\theta)|\Psi_0\rangle \\ \equiv \\ |\Psi(\theta)\rangle$$

Measurement  $H$

DONE

Average

Optimize

$$\theta, E(\theta)$$

Quantum

Classical

# Ansatz circuit

- Inspiration from computational chemistry:  
Coupled Cluster (CC) method

$$|\Psi_{CC}\rangle = e^T |\Psi_0\rangle$$

$$T = \sum_i T_i \quad T_1 = \sum_{i,\alpha} t_{\alpha}^i a_{\alpha}^{\dagger} a_i \quad T_2 = \sum_{i,j,\alpha,\beta} t_{\alpha\beta}^{ij} a_{\alpha}^{\dagger} a_{\beta}^{\dagger} a_i a_j$$

- **Unitary** Couple Cluster (UCC) ansatz on quantum computers

# Ansatz circuit

- UCC is the unitary version of CC

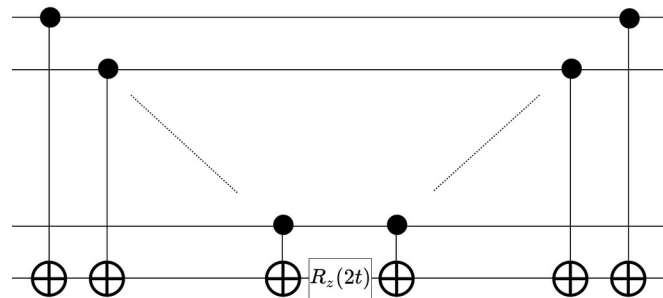
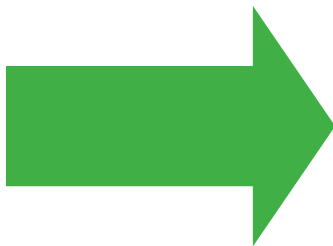
$$|\Psi_{UCC}\rangle = e^{T-T^\dagger} |\Psi_0\rangle$$

- Unitary  $e^{T-T^\dagger}$  can be implemented on a quantum computer
- Usually truncated to Single and Double excitations: UCCSD

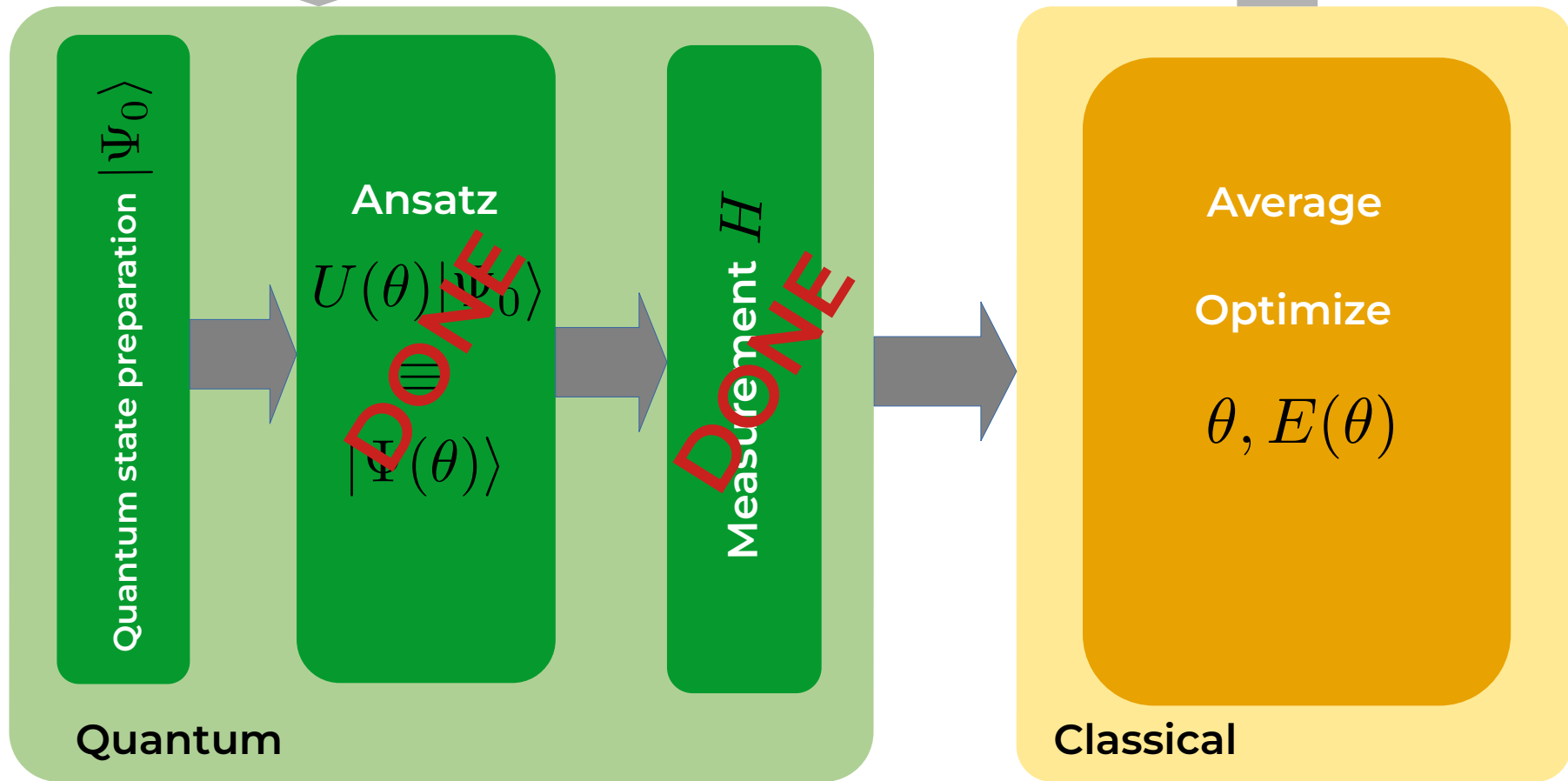
# Ansatz circuit

- Implement UCC using Trotter-Suzuki decomposition of cluster operator  $e^{T-T^\dagger}$
- Map exponents to qubits
- Qubit exponents realized as circuits

$$e^{-i\theta Z_1 X_2 \dots Y_n}$$



Parameter update  $\theta \longrightarrow \theta'$

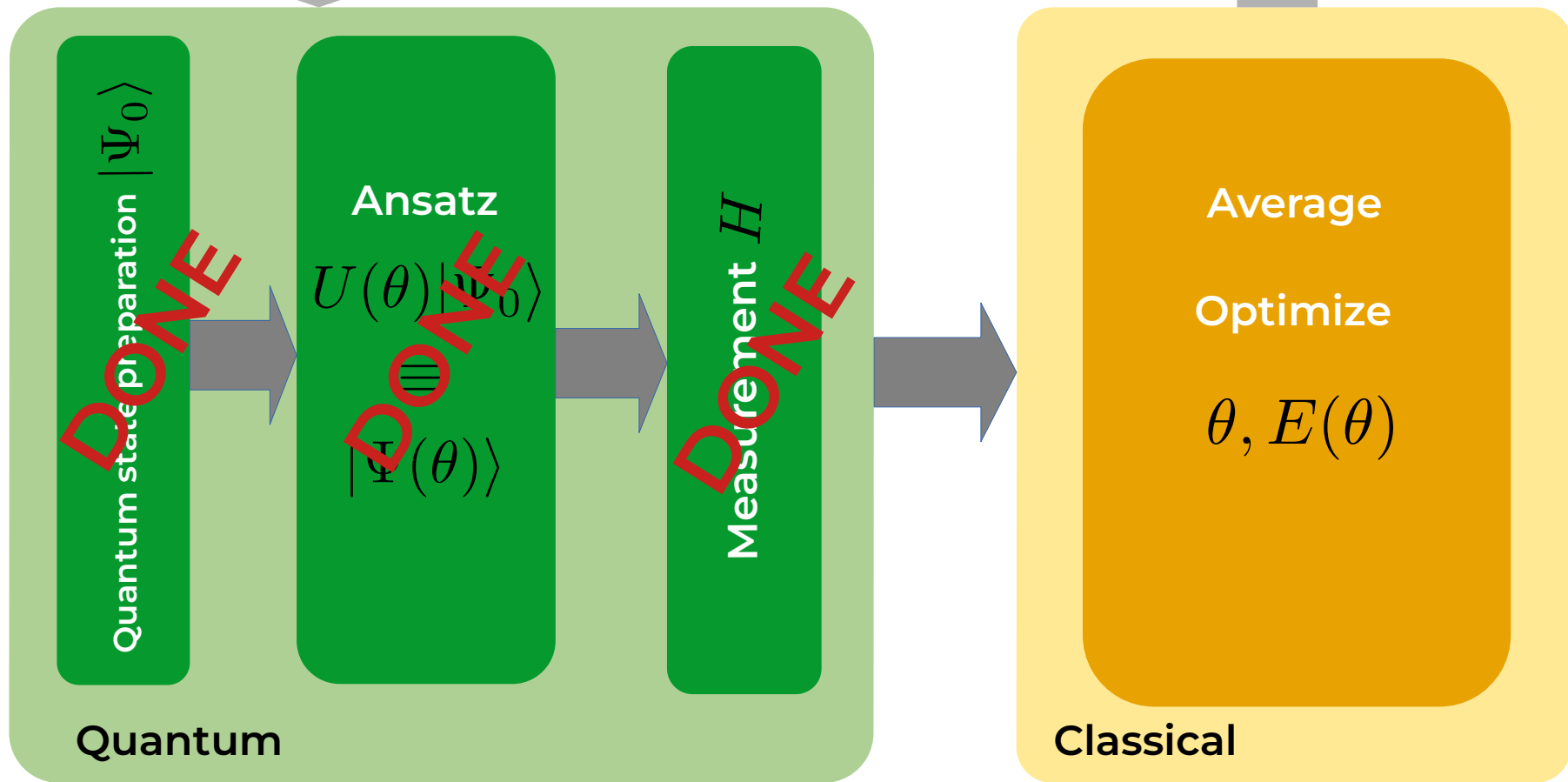


# Initial state

- Classically compute the Hartree-Fock (HF) state
- Map to qubit state using Jordan-Wigner mapping, and prepare on the quantum computer
- Example: H2 with 4 qubits

$$|\Psi_0^{\text{HF}}\rangle = |0011\rangle$$

Parameter update  $\theta \longrightarrow \theta'$

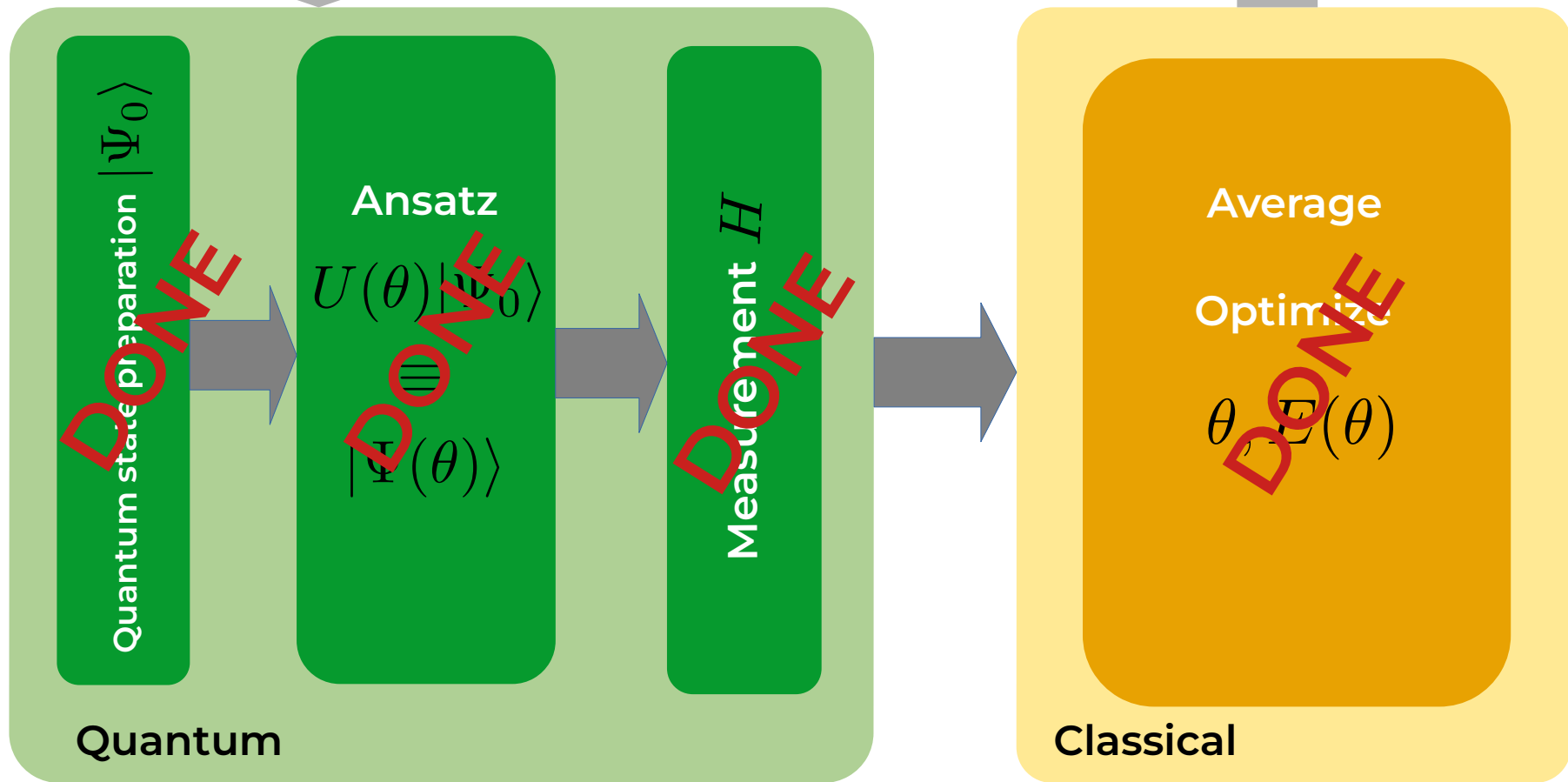




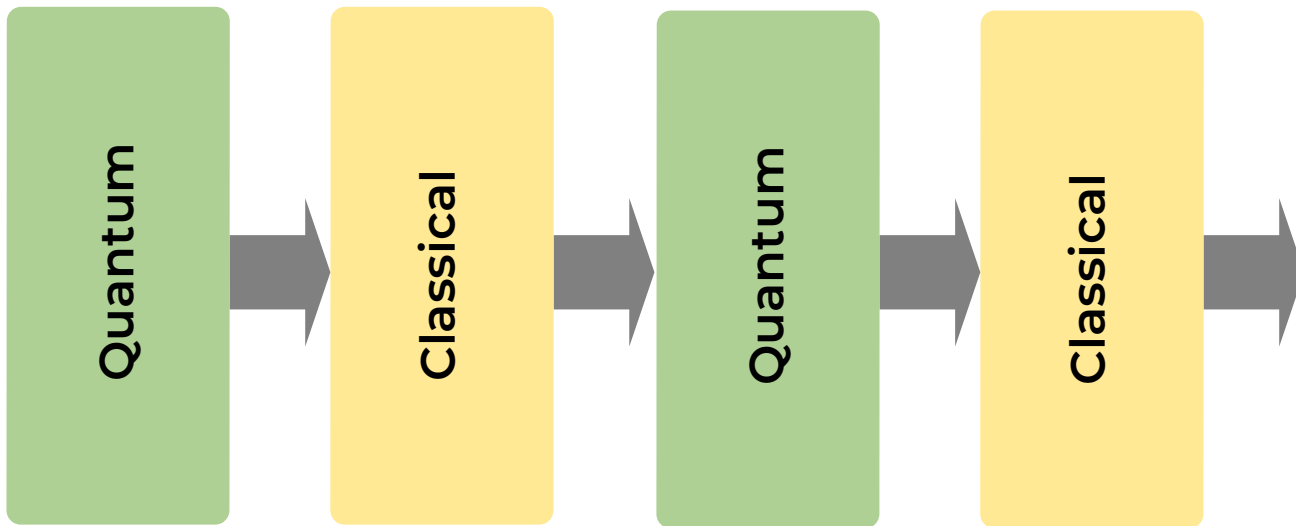
# Optimization

- Optimization algorithm (Nelder-Mead, COBYLA, TNC, etc)
- Gradient based algorithms
- Combinations of different approaches

Parameter update  $\theta \longrightarrow \theta'$



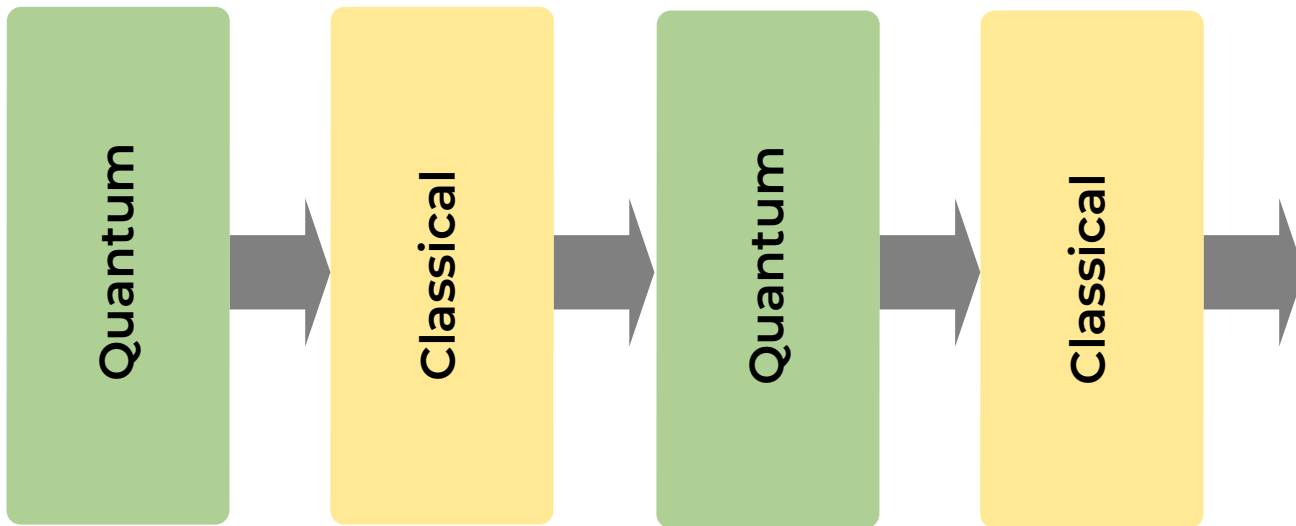
# Running VQE



**VQE advantage:**

after each run the quantum circuit is reset, so  
"short" coherence time enough

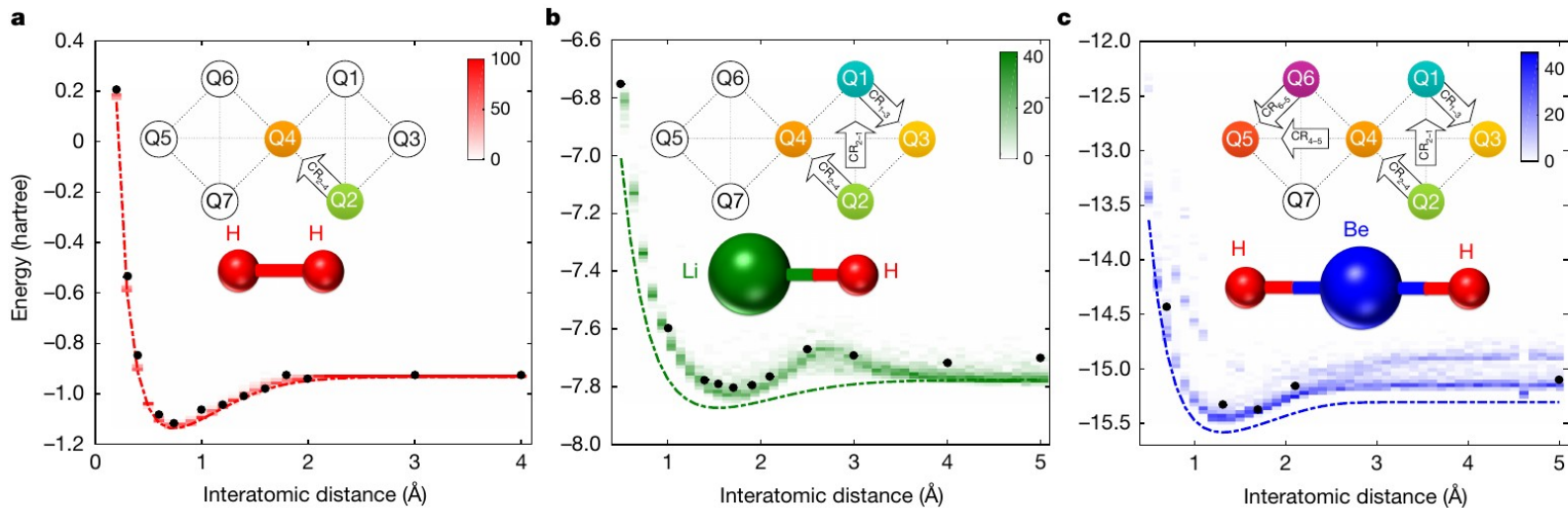
# Running VQE



**VQE challenge:**  
is quantum coherence time long enough?

# Results: small molecules

- H<sub>2</sub>, LiH, BeH<sub>2</sub> implemented on quantum hardware



Kandala et al 2017, Nature 549, 242-246

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