

# Multiconfigurational methods: past, present and the road ahead

Stefan Knecht



# Content of the lectures

- Concepts

## Past

- CASCI
- MCSCF/CASSCF
- MR Dynamical Correlation Approaches

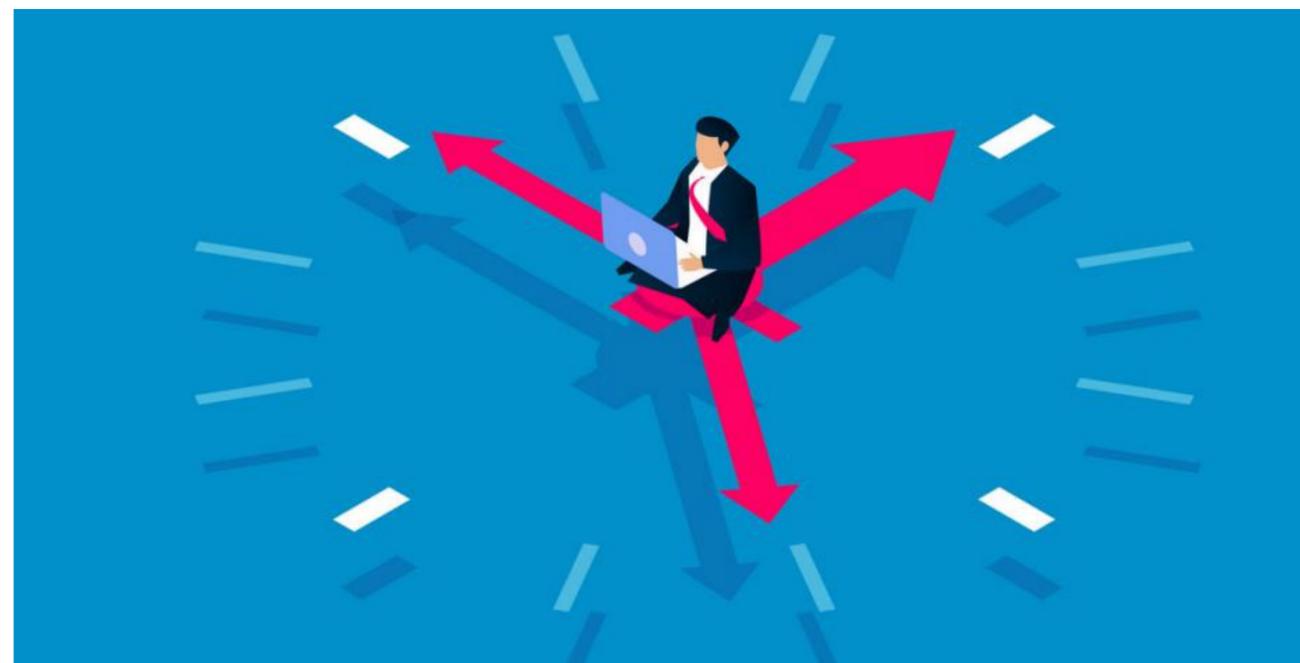
## Present: “Sample” CI coefficients using an advanced optimisation algorithm

- Density Matrix Renormalisation Group

## Road ahead: Beyond “classical quantum chemistry”

- Quantum Chemistry on Quantum Computers

# The Present ...



# Second example: the Cr<sub>2</sub> puzzle resolved

H. R. Larsson, H. Zhai, C. J. Umrigar, G. K.-L. Chan, JACS, 144, 15932 (2022)

# Cr<sub>2</sub> potential energy curve...

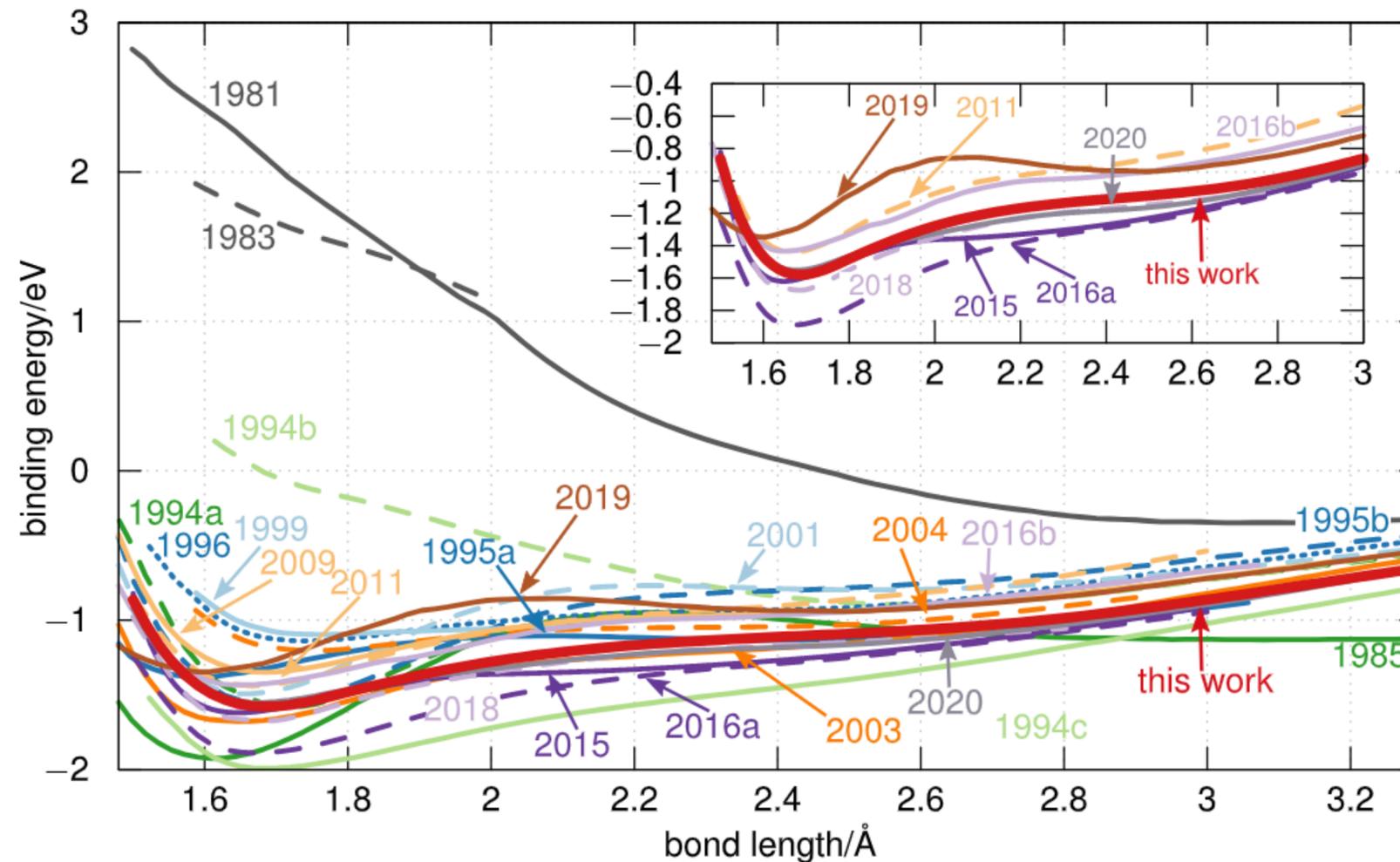


FIG. 1. Some of the simulated potential energy curves (PECs) of the chromium dimer that are available in the literature. The PECs are labeled by the study's year. The red curve marks the PEC from this work. The inset shows selected PECs from 2011 onwards. (List of references in SI).

Short and weak bond with a narrow minimum around 1.68 Å & extended shelf at around 2.5 Å.  
→ Cr 4s and 3d AOs different in size, with the minimum corresponding mostly to 3d orbital interactions and the shelf to 4s orbital interactions.

# A unique bonding and its consequences

- Complex electronic structure arises from **interplay of two types of electron correlation**
  - **type I** — “static correlation”: spin-coupling of the 12 valence electrons ( $3d + 4s$  shells)

*energy-driven degeneracy*

- **type II** — “spatial correlation / dynamic correlation”: need for a large basis to capture excitations involving non-valence orbitals

*overlap-driven degeneracy*

—> formation of  $3d-3d$  bonds requires the  $3p$  electrons to move out of the same spatial region by exciting to higher lying orbitals

- **Challenge:**

“The problem is computationally challenging because **both the static and dynamic correlation** must be computed sufficiently well even for a qualitatively reasonable description.”

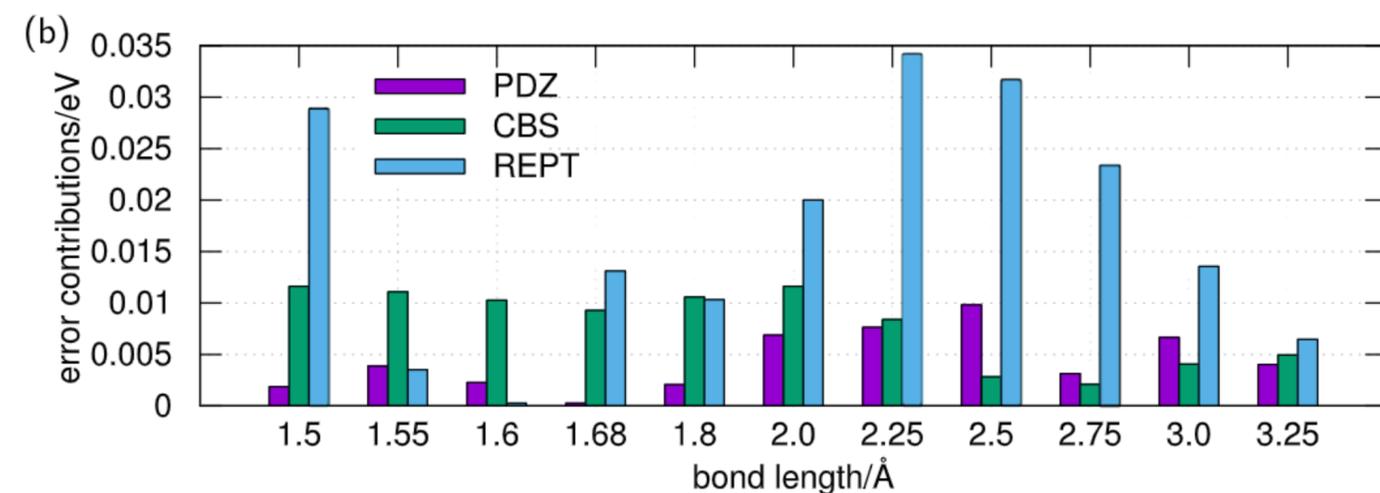
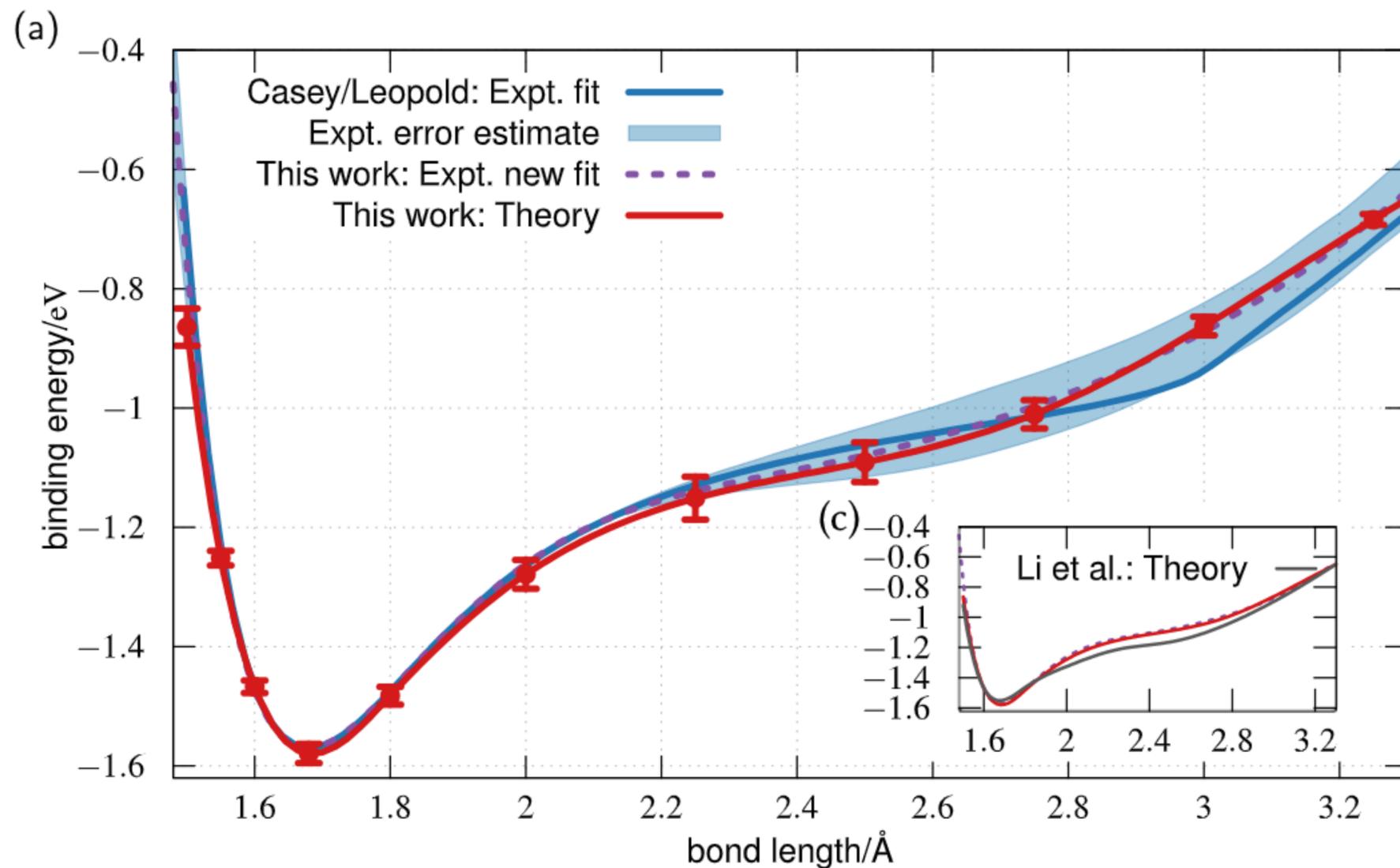
# Computational approach I

$$\Delta E = \Delta E_{\text{PDZ}}(\text{“exact”}) + \Delta E_{\text{CBS}}(\text{MPS-REPT2}) - \Delta E_{\text{DZ}}(\text{MPS-REPT2})$$

- Static electron correlation: CAS(28e,76o)/cc-pVDZ-DK
  - Heat-Bath CI (selective CI)
  - DMRG (with huge bond dimension!)
- Dynamic electron correlation: CAS(12,12)/MRPT2
  - PT2 correlation of 3s and 3p inner-valence shells
  - all secondary shells considered
- Basis set: MRPT2 with cc-pvNZ-DK (N=2,3,4,5) with extrapolation to CBS limit



# New state-of-the-art



$$\epsilon = \sqrt{\epsilon_{\text{PDZ}}^2 + \epsilon_{\text{CBS}}^2 + \epsilon_{\text{REPT}}^2},$$

with the individual error contributions as defined above,

$$\epsilon_{\text{PDZ}} = |\Delta E(\text{SHCI}) - \Delta E(\text{DMRG})|/2,$$

$$\epsilon_{\text{CBS}} = \sigma_{\text{CBS}},$$

$$\epsilon_{\text{REPT}} = |\Delta E(\text{MPS-REPT2}) - \Delta E[\text{UCCSD(T)}]|/2.$$

# Thinking outside the box

## Standard CI approach

- CI-type diagonalization for a **preselected** set of many-particle basis states

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

- Could we do better or, say, something else?

# Thinking outside the box

## Standard CI approach

- CI-type diagonalization for a **preselected** set of many-particle basis states

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

- Could we do better or, say, something else?
  - select many-particle basis sets / configurations / etc. based on some energy/weighting criteria:
    - selected CI approaches
    - difference dedicated CI,
    - many-body expansion FCI
    - ...
  - find “best” many-particle basis set based on correlations among orbitals → **DMRG**

# Thinking outside the box

## Standard CI approach

- CI-type diagonalization for a **preselected** set of many-particle basis states

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

## DMRG

- **Determine** CI coefficients from correlations among orbitals

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

- Local space  $k_l$  of  $l$ -th spatial orbital is of dimension  $d = 4$ :

$$k_l = \{ |\uparrow\downarrow\rangle, |\uparrow\rangle, |\downarrow\rangle, |0\rangle \}$$

From a CI wave function to Matrix Product States (MPS):  
Optimising an MPS with the DMRG algorithm

# Optimising an MPS wave function with the DMRG algorithm

- Optimisation algorithm
- Parameters that determine DMRG accuracy

U. Schollwöck, The density-matrix renormalization group in the age of matrix product states, *Annals of Physics*, 326 (2011) 96–192.

# Some reviews on about 20 years of DMRG in quantum chemistry

- Ö. Legeza *et al.*, Lect. Notes Phys., 739, 653 (2008)
- G. K.-L. Chan *et al.*, Prog. Theor. Chem. and Phys., 18, 49 (2008)
- D. Zgid and G. K.-L. Chan, Ann. Rep. Comp. Chem., 5, 149, (2009)
- G. K.-L. Chan and S. Sharma, Ann. Rev. Phys. Chem., 62, 465 (2011)
- K. Marti and M. Reiher, Phys. Chem. Chem. Phys., 13, 6750 (2011)
- U. Schollwöck, Ann. Phys., 326, 96 (2011)
- G. K.-L. Chan, WIREs, 2, 907 (2012)
- Y. Kurashige, Mol. Phys., 112, 1485 (2013)
- S. Wouters and D. van Neck, Eur. Phys. J. D, 68, 272 (2014)
- S. Szalay *et al.*, Int. J. Quantum Chem. 115, 1342 (2015)
- T. Yanai *et al.*, Int. J. Quantum Chem., 115, 283 (2015)
- G. K.-L. Chan *et al.*, J. Chem. Phys., 145, 014102 (2016)
- A. Baiardi and M. Reiher, J. Chem. Phys. 152, 040903 (2020)

# Intermission: singular value decomposition

- Singular value decomposition (SVD) of a matrix  $\mathbf{M}$  ( $n_a \times n_b$ )



Remember?

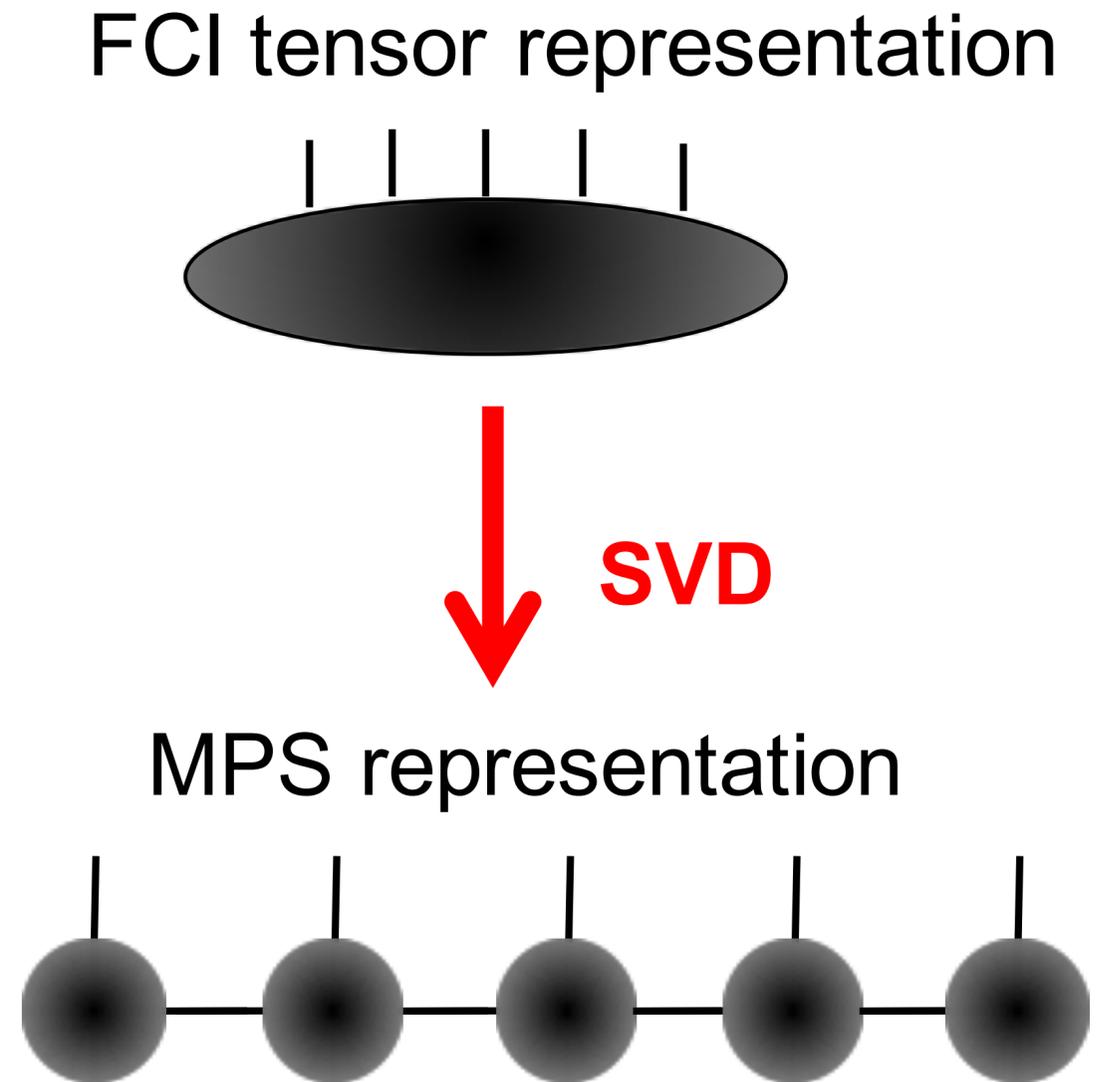
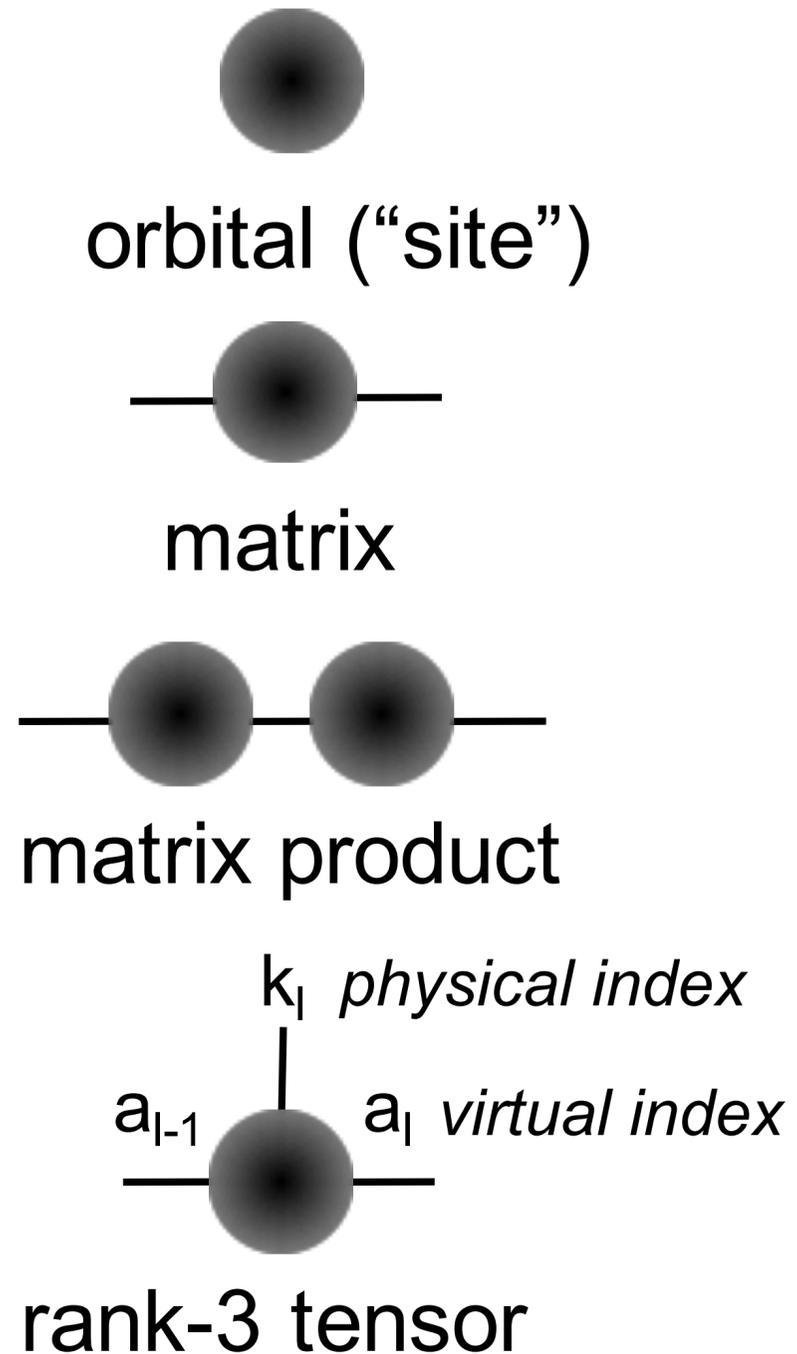
yields:

- Left-singular matrix  $\mathbf{U}$  ( $n_a \times \min(n_a, n_b)$ ) with  $\mathbf{U}^\dagger \mathbf{U} = \mathbf{1}$
- Right-singular matrix  $\mathbf{V}$  ( $\min(n_a, n_b) \times n_b$ ) with  $\mathbf{V}^\dagger \mathbf{V} = \mathbf{1}$
- Diagonal singular value matrix  $\mathbf{S}$  ( $\min(n_a, n_b) \times \min(n_a, n_b)$ ) with  $r$  nonzero singular values  $\rightarrow r$  is the (Schmidt) rank of  $\mathbf{M}$

$$\begin{array}{c} n_b \\ \boxed{\mathbf{M}} \\ n_a \end{array} = \begin{array}{c} n_a \\ \boxed{\mathbf{U}} \\ n_a \\ \text{column-wise orthonormal} \\ \text{vectors} \end{array} \begin{array}{c} n_a \\ \boxed{\mathbf{S}} \\ n_a \end{array} \begin{array}{c} n_b \\ \boxed{\mathbf{V}^+} \\ n_a \\ \text{row-wise orthonormal} \\ \text{vectors} \end{array}$$

# From a CI to an MPS parametrisation I

- Successive application of SVD to CI tensor  $\rightarrow$  MPS wave function



# From a CI to an MPS parametrisation II

- Reshape coefficient tensor  $c_{k_1, k_2, \dots, k_L}$  into a  $d \times d^{L-1}$  matrix  $\Gamma$

$$\Gamma_{k_1, (k_2, \dots, k_L)} = c_{k_1, k_2, \dots, k_L}$$

- SVD of  $\Gamma_{k_1, (k_2, \dots, k_L)}$  yields

$$\begin{aligned}\Gamma_{k_1, (k_2, \dots, k_L)} &= \sum_{a_1}^{r_1} U_{k_1, a_1} S_{a_1, a_1} (V^\dagger)_{a_1, (k_2, \dots, k_L)} \\ &\equiv \sum_{a_1}^{r_1} A_{1, a_1}^{k_1} c_{a_1, (k_2, \dots, k_L)}\end{aligned}$$

with

- $\mathbf{S}$  and  $\mathbf{V}^\dagger$  multiplied and reshaped into coefficient tensor  $c_{a_1, (k_2, \dots, k_L)}$
- $r_1 \leq d$
- collection of  $d$  ( $= 4$ ) row vectors  $A^{k_1}$  with entries  $A_{1, a_1}^{k_1} = U_{k_1, a_1}$

# From a CI to an MPS parametrisation III

- Reshape coefficient tensor  $c_{a_1, (k_2, \dots, k_L)}$  into a  $r_1 d \times d^{L-2}$  matrix  $\Gamma$

$$c_{k_1, k_2, \dots, k_L} = \sum_{a_1}^{r_1} A_{1, a_1}^{k_1} \Gamma_{(a_1 k_2), (k_3, \dots, k_L)}$$

$$\stackrel{\text{SVD}}{=} \sum_{a_1}^{r_1} \sum_{a_2}^{r_2} A_{1, a_1}^{k_1} U_{(a_1 k_2), a_2} S_{a_2, a_2} (V^\dagger)_{a_2, (k_3, \dots, k_L)}$$

$$\stackrel{\text{reshape}}{\equiv} \sum_{a_1}^{r_1} \sum_{a_2}^{r_2} A_{1, a_1}^{k_1} A_{a_1, a_2}^{k_2} \Gamma_{(a_2 k_3), (k_4, \dots, k_L)}$$

with

- $\mathbf{S}$  and  $\mathbf{V}^\dagger$  multiplied and reshaped into coefficient tensor  $c_{a_1, (k_2, \dots, k_L)}$
- $r_2 \leq r_1 d \leq d^2$
- collection of  $d$  matrices  $A^{k_2}$  with entries  $A_{a_1, a_2}^{k_2} = U_{(a_1 k_2), a_2}$

# From a CI to an MPS parametrisation IV

- Continue with SVDs until last site which then gives

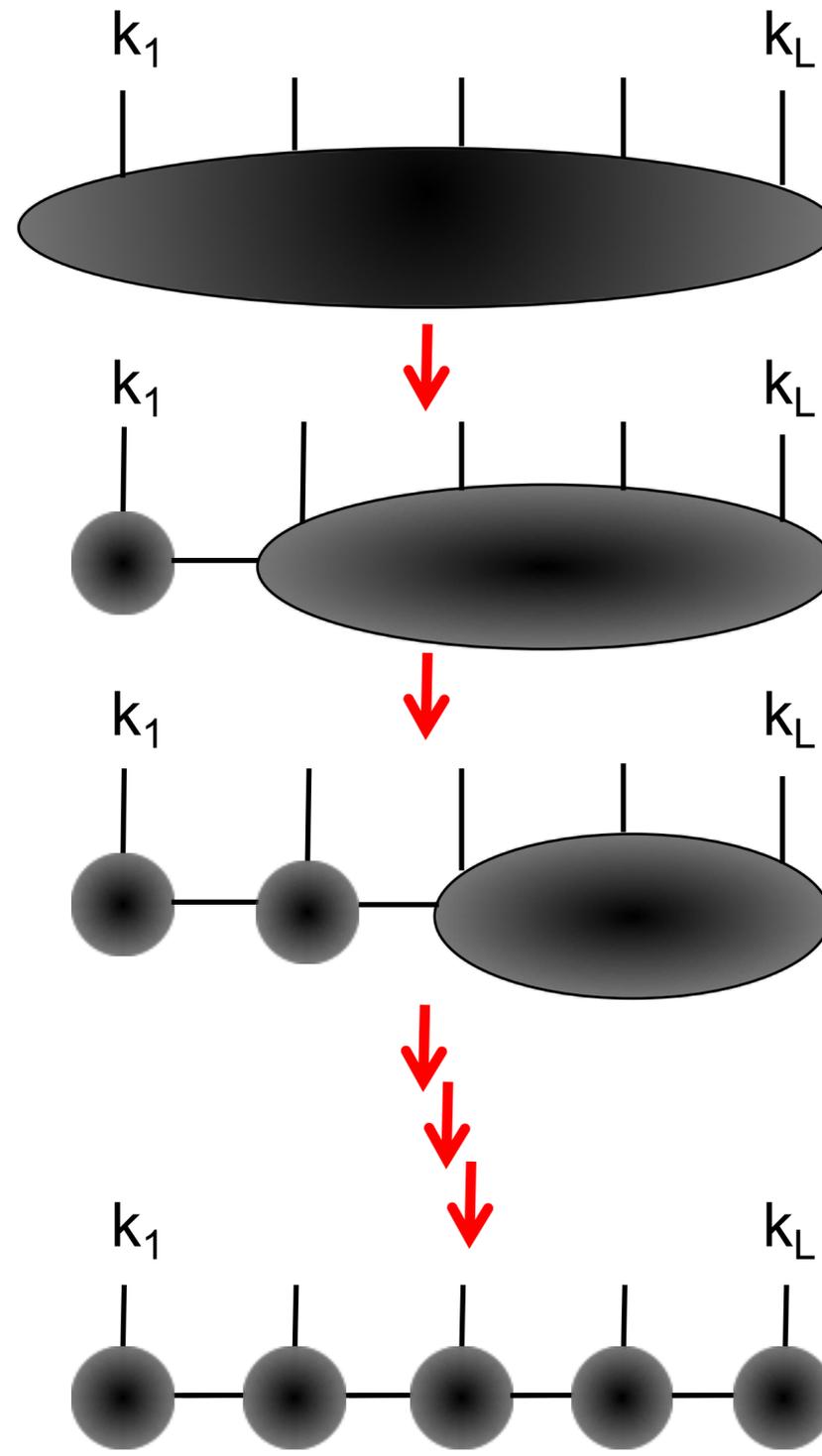
$$\begin{aligned} c_{k_1, k_2, \dots, k_L} &= \sum_{a_1, a_2, \dots, a_{L-1}} A_{1, a_1}^{k_1} A_{a_1, a_2}^{k_2} \cdots A_{a_{L-2}, a_{L-1}}^{k_{L-1}} A_{a_{L-1}, 1}^{k_L} \\ &\equiv A^{k_1} A^{k_2} \cdots A^{k_{L-1}} A^{k_L} \end{aligned}$$

with

- interpretation of sums as matrix-matrix multiplications
- first and last **matrices** are row- and column vectors!
- CI wave function rewritten as MPS wave function:

$$|\Psi\rangle = \sum_k c_k |\mathbf{k}\rangle = \sum_{k_1, k_2, \dots, k_L} A^{k_1} A^{k_2} \cdots A^{k_{L-1}} A^{k_L} |\mathbf{k}\rangle$$

# From a CI to an MPS parametrisation $V$

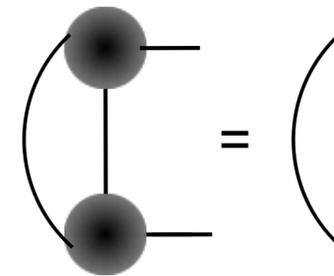


# Properties of the MPS I

- Matrix dimensions grow exponentially up to  $\dim(d^{L/2-1} \times d^{L/2})$  if no truncation occurs, i.e., all singular values are kept

- From  $U^\dagger U = I$  follows that all matrices  $\{A^{k_l}\}$  are **left-normalised**

$$\sum_{k_l} A^{k_l \dagger} A^{k_l} = I$$



- MPS built from left-normalised matrices is called **left-canonical**

- For any lattice bipartition at site  $l$ , the states on sites  $1, \dots, l$

$$|a_l\rangle_{\mathcal{L}} = \sum_{k_1, k_2, \dots, k_l} (A^{k_1} \dots A^{k_l})_{1, a_l} |k_1, \dots, k_l\rangle$$

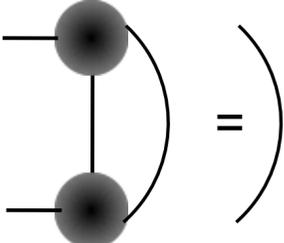
span a left subsystem  $\mathcal{L}$  and form an orthonormal basis

# Properties of the MPS II

- Starting SVD on coefficient tensor from right-hand side

$$\Gamma_{(k_1, k_2, \dots, k_{L-1}), k_L} = C_{k_1, k_2, \dots, k_L}$$

yields **right-normalised** matrices  $\{B^{k_l}\}$  (as  $V^\dagger V = I$ )

$$\sum_{k_l} B^{k_l} B^{k_l \dagger} = I$$


- MPS built from right-normalised matrices is called **right-canonical**
- For any lattice bipartition at site  $l + 1$ , the states on sites  $l + 1 \dots, L$

$$|a_{l+1}\rangle_{\mathcal{R}} = \sum_{k_{l+1}, k_{l+2}, \dots, k_L} (B^{k_{l+1}} \dots B^{k_L})_{a_l, 1} |k_{l+1}, \dots, k_L\rangle$$

span a right subsystem  $\mathcal{R}$  and form an orthonormal basis

# Gauge freedom and mixed-canonical form

- MPS representations are not unique  $\leftrightarrow$  existence of a gauge degree of freedom
- Consider two adjacent matrices  $M^{k_l}$  and  $M^{k_{l+1}}$  of shared column/row dimension  $D$  and a square invertible matrix  $X$  ( $D \times D$ )
- **Invariance** of MPS immediately follows from

$$M^{k_l} \rightarrow M^{k_l} X; \quad M^{k_{l+1}} \rightarrow X^{-1} M^{k_{l+1}}$$

since

$$M^{k_l} \underbrace{XX^{-1}}_{=I} M^{k_{l+1}} = M^{k_l} \cdot M^{k_{l+1}}$$

# Mixed-canonical MPS representation

- Gauge freedom allows to write an MPS in **mixed canonical** form at sites  $\{l, l + 1\}$

$$|\Psi\rangle = \sum_{\mathbf{k}} A^{k_1} \dots A^{k_{l-1}} M^{k_l k_{l+1}} B^{k_{l+2}} \dots B^{k_L} |\mathbf{k}\rangle$$

by starting from a general MPS wave function

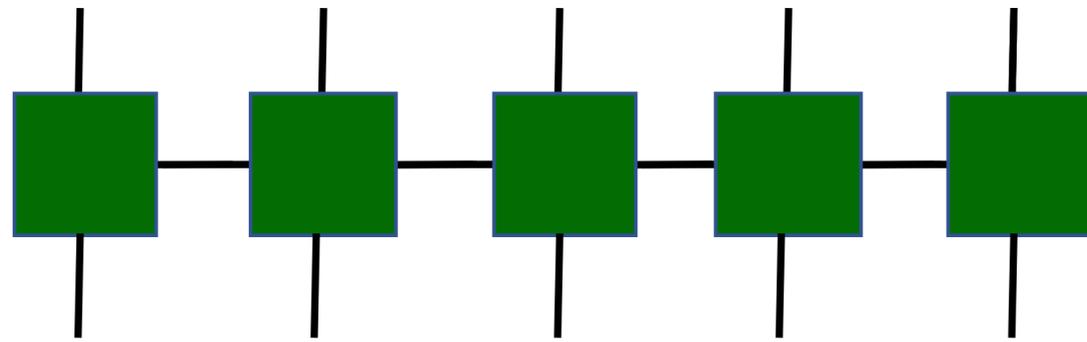
$$|\Psi\rangle = \sum_{\mathbf{k}} M^{k_1} M^{k_2} \dots M^{k_L} |\mathbf{k}\rangle$$

and the **two-site MPS tensor**  $M^{k_l k_{l+1}}$  reading as

$$M^{k_l k_{l+1}} \equiv M_{a_{l-1}, a_{l+1}}^{k_l k_{l+1}} = \sum_{a_l} M_{a_{l-1}, a_l}^{k_l} M_{a_l, a_{l+1}}^{k_{l+1}}$$

# Matrix product operators I

- MPS concept applied to operators  $\rightarrow$  matrix product operators (MPOs)



- $N$ -electron operator  $\widehat{\mathcal{W}}$  in MPO form

$$\begin{aligned}\widehat{\mathcal{W}} &= \sum_{kk'} \sum_{b_1, \dots, b_{L-1}} W_{1,b_1}^{k_1 k'_1} W_{b_1, b_2}^{k_2 k'_2} \dots W_{b_{L-1}, 1}^{k_L k'_L} |k\rangle \langle k'| \\ &= \sum_{kk'} W^{k_1 k'_1} W^{k_2 k'_2} \dots W^{k_L k'_L} |k\rangle \langle k'| \\ &\equiv \sum_{kk'} w_{kk'} |k\rangle \langle k'| \end{aligned}$$

# Matrix product operators II

- For efficiency, rearrange summations such that the contraction proceeds first over the local site indices  $k_l k'_l$

$$\widehat{W}_{b_{l-1}, b_l}^l = \sum_{k_l k'_l} W_{b_{l-1}, b_l}^{k_l k'_l} |k_l\rangle \langle k'_l|$$

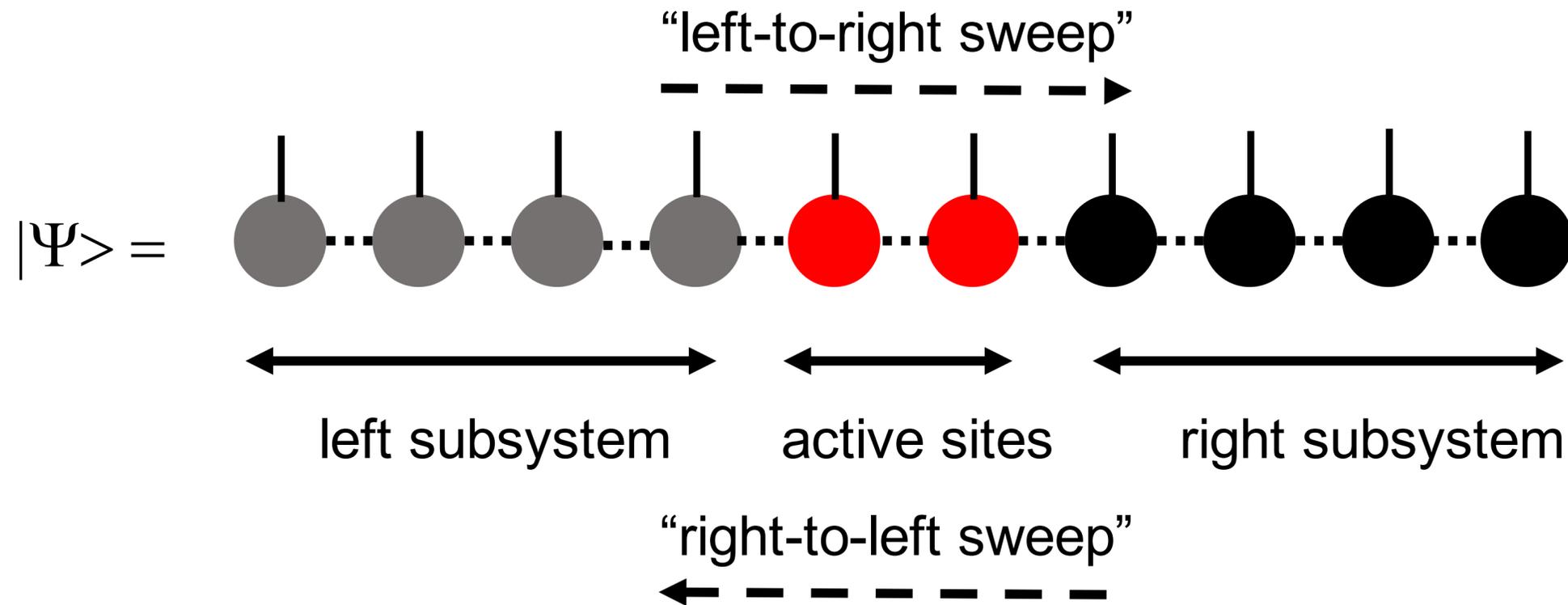
- This allows us to write the equation on previous slide as

$$\widehat{\mathcal{M}} = \sum_{b_1, \dots, b_{L-1}} \widehat{W}_{1, b_1}^1 \cdots \widehat{W}_{b_{l-1}, b_l}^l \cdots \widehat{W}_{b_{L-1}, 1}^L$$

- **Note:** the entries of  $\{\widehat{W}_{b_{l-1}, b_l}^l\}$  matrices comprise the elementary, *local* operators acting on the  $l$ -th orbital, e.g.,

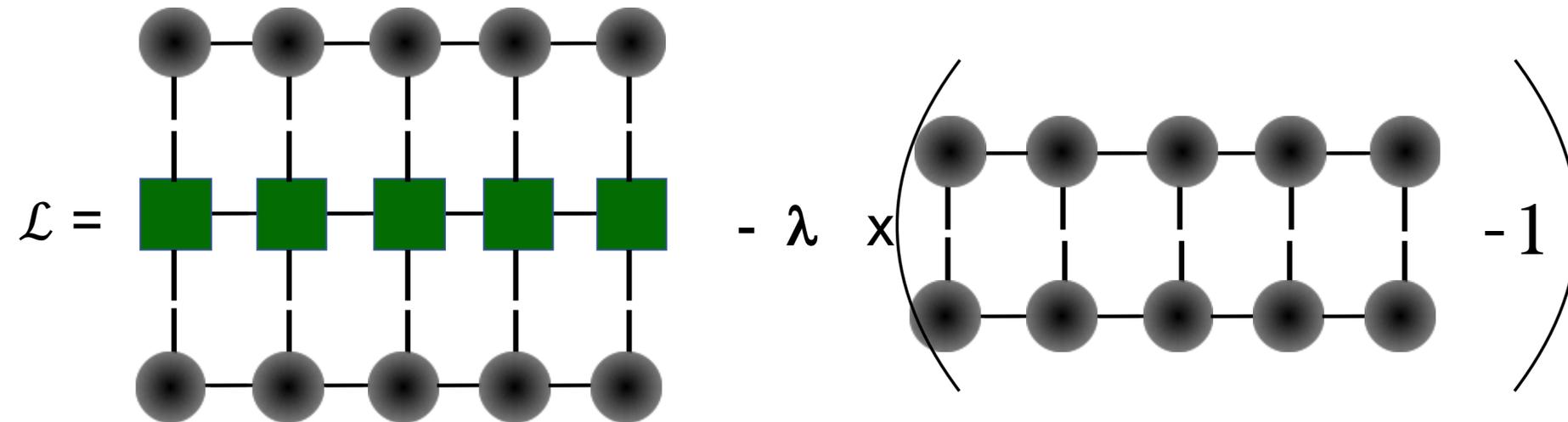
$$\tilde{a}_{\uparrow l}^\dagger = |\uparrow \downarrow\rangle \langle \downarrow| + |\uparrow\rangle \langle 0|$$

# Variational MPS optimisation I



- **Goal:** find optimal approximation  $|\tilde{\Psi}\rangle$  to  $|\Psi\rangle$  (in a least-square sense)
- Prerequisite: initialise suitable (valid) trial MPS wave function  $|\tilde{\Psi}\rangle$ 
  - choices: random guess, encode HF determinant, CI-DEAS, “old MPS” ...
  - assume normalisation, i.e.,  $\langle\Psi|\Psi\rangle = 1$

# Variational MPS optimisation II



- *Ansatz* for variational MPS optimization: extremize the Lagrangian

$$\mathcal{L} = \langle \Psi | \hat{H} | \Psi \rangle - \lambda \left( \langle \Psi | \Psi \rangle - 1 \right)$$

with the two-site  $\{M^{k_l k_{l+1}}\}$  matrices as optimization parameters

- Optimize at each step of a "sweep" entries of site matrices of **two orbitals** ("two-site DMRG") while keeping all the others fixed
- Sweep through all sites multiple times until energy converges

# Variational MPS optimisation III

- At sites  $\{l, l + 1\}$ , take derivative of  $\mathcal{L}$  with respect to complex conjugate of  $M^{k_l, k_{l+1}}$

$$\frac{\partial}{\partial M^{k_l, k_{l+1}*}} \left( \langle \Psi | \hat{H} | \Psi \rangle - \lambda \left[ \langle \Psi | \Psi \rangle - 1 \right] \right) = 0$$

which then yields

$$\sum_{\substack{a'_{l-1} a'_l \\ b_{l-1} b_{l+1}}} \sum_{k'_l k'_{l+1}} L^{b_{l-1}}_{a_{l-1}, a'_{l-1}} W^{k_l k_{l+1}, k'_l k'_{l+1}}_{b_{l-1}, b_{l+1}} R^{b_{l+1}}_{a'_{l+1}, a_{l+1}} M^{k'_l k'_{l+1}}_{a'_{l-1}, a'_{l+1}} = \lambda \sum_{a'_{l-1} a'_l} \Psi^A_{a'_{l-1}, a_{l-1}} \\ \times M^{k'_l k'_{l+1}}_{a'_{l-1}, a'_{l+1}} \\ \times \Psi^B_{a'_{l+1}, a_{l+1}}$$

- $L$  and  $R$ : *left* and *right boundaries* obtained by contracting the MPO with the bra and ket MPS starting from left (right) up to sites  $l - 1$  ( $l + 1$ )

# Variational MPS optimisation IV

$$\mathcal{L} = \left[ \begin{array}{c} \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \color{green}{\square} \color{green}{\square} \color{green}{\square} \color{green}{\square} \color{green}{\square} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \end{array} \right] - \lambda \times \left( \begin{array}{c} \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \end{array} \right) - 1$$

$$\frac{\partial}{\partial M^{k_l, k_{l+1}^*}}$$



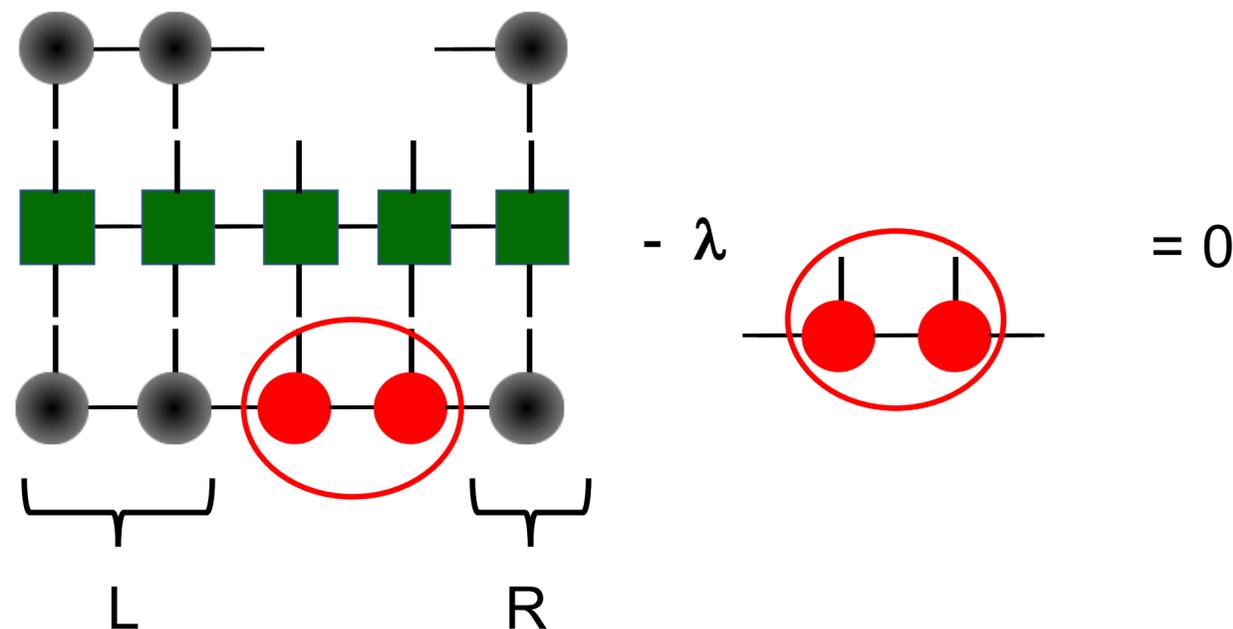
$$\left[ \begin{array}{c} \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \color{green}{\square} \color{green}{\square} \color{green}{\square} \color{green}{\square} \color{green}{\square} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ \underbrace{\hspace{2cm}}_L \quad \underbrace{\hspace{2cm}}_R \end{array} \right] - \lambda \left[ \begin{array}{c} \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ | \quad | \quad | \quad | \quad | \\ \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \bullet \text{---} \\ \underbrace{\hspace{2cm}}_{\Psi^A} \quad \underbrace{\hspace{2cm}}_{\Psi^B} \end{array} \right] = 0$$

# Variational MPS optimisation V

- **NB:** Simplify *generalized eigenvalue problem* to a *standard eigenvalue problem*

$$\sum_{\substack{a'_{l-1} a'_l \\ b_{l-1} b_{l+1}}} \sum_{k'_l k'_{l+1}} L^{b_{l-1}}_{a'_{l-1}, a'_l} W^{k_l k_{l+1}, k'_l k'_{l+1}} R^{b_{l+1}}_{a'_{l+1}, a_{l+1}} M^{k'_l k'_{l+1}}_{a'_{l-1}, a'_{l+1}} = \lambda M^{k'_l k'_{l+1}}_{a'_{l-1}, a'_{l+1}}$$

if MPS is a canonical MPS!



- Requires the initial MPS to be right-normalized!

# Variational MPS optimisation VI

- Recast last equation into a matrix eigenvalue equation

$$\mathcal{H}v - \lambda v = 0$$

- by defining a local Hamiltonian matrix  $\mathcal{H}$  at sites  $\{l, l + 1\}$

$$H_{(k_l k_{l+1} a_{l-1} a_{l+1}), (k'_l k'_{l+1} a'_{l-1} a'_{l+1})} = \sum_{b_{l-1}, b_{l+1}} L_{a_{l-1}, a'_{l-1}}^{b_{l-1}} W_{b_{l-1}, b_{l+1}}^{k_l k_{l+1}, k'_l k'_{l+1}} R_{a'_{l+1}, a_{l+1}}^{b_{l+1}}$$

- and a vector  $v$

$$v_{k'_l k'_{l+1} a'_{l-1} a'_{l+1}} = M_{a'_{l-1}, a'_{l+1}}^{k'_l k'_{l+1}}$$

- Solving EV problem  $\rightarrow$  eigenvalue  $\lambda^0$  and corresponding eigenvector  $v_{k'_l k'_{l+1} a'_{l-1} a'_{l+1}}^0$

# Variational MPS optimisation VII

- Reshape  $v_{k'_l k'_{l+1} a'_{l-1} a'_{l+1}}^0$  back to  $M_{a'_{l-1}, a'_{l+1}}^{k'_l k'_{l+1}}$
- $M_{a'_{l-1}, a'_{l+1}}^{k'_l k'_{l+1}}$  is subsequently subject to a left- or right-normalisation (SVD!)

$$M_{a'_{l-1}, a'_{l+1}}^{k'_l k'_{l+1}} = M_{(k'_l, a'_{l-1})(k'_{l+1}, a'_{l+1})} = U_{(k'_l, a'_{l-1})s_l} S_{s_l s_l} V_{s_l(a'_{l+1}, k'_{l+1})}$$

- By **discarding** the  $3m$  smallest singular values in  $S_{s_l s_l}$  to obtain  $S_{a'_l a'_l}$  we achieve the **desired reduction in bond dimensionality!**
- The maximum (fixed) number  $m$  of retained singular values is usually called **number of renormalized block states**

# Variational MPS optimisation VIII

- Discarding  $3m$  smallest singular values corresponds to discarding the last  $3m$  columns (rows) of  $U$  ( $V$ ) such that

$$A_{a'_{l-1}, a'_l}^{k'_l} \equiv U_{(k'_l, a'_{l-1}) a'_l}$$
$$M_{a'_l, a'_{l+1}}^{k'_{l+1}} = \frac{1}{1 - \sum_{s_l=m+1}^{4m} S_{s_l s_l}} S_{a'_l a'_l} V_{a'_l (a'_{l+1}, k'_{l+1})}$$

- Energy calculated as a function of the truncation error  $\epsilon$

$$\epsilon = \sum_{s_l=m+1}^{4m} S_{s_l s_l} = ||\Psi_{16m^2} - \Psi_{4m^2}||$$

can be employed to obtain an error estimate through extrapolation

# Variational MPS optimisation IX

- Moving from sites  $\{l, l + 1\}$  to sites  $\{l + 1, l + 2\}$  then completes the local optimization step

# Scaling of variational MPS optimisation

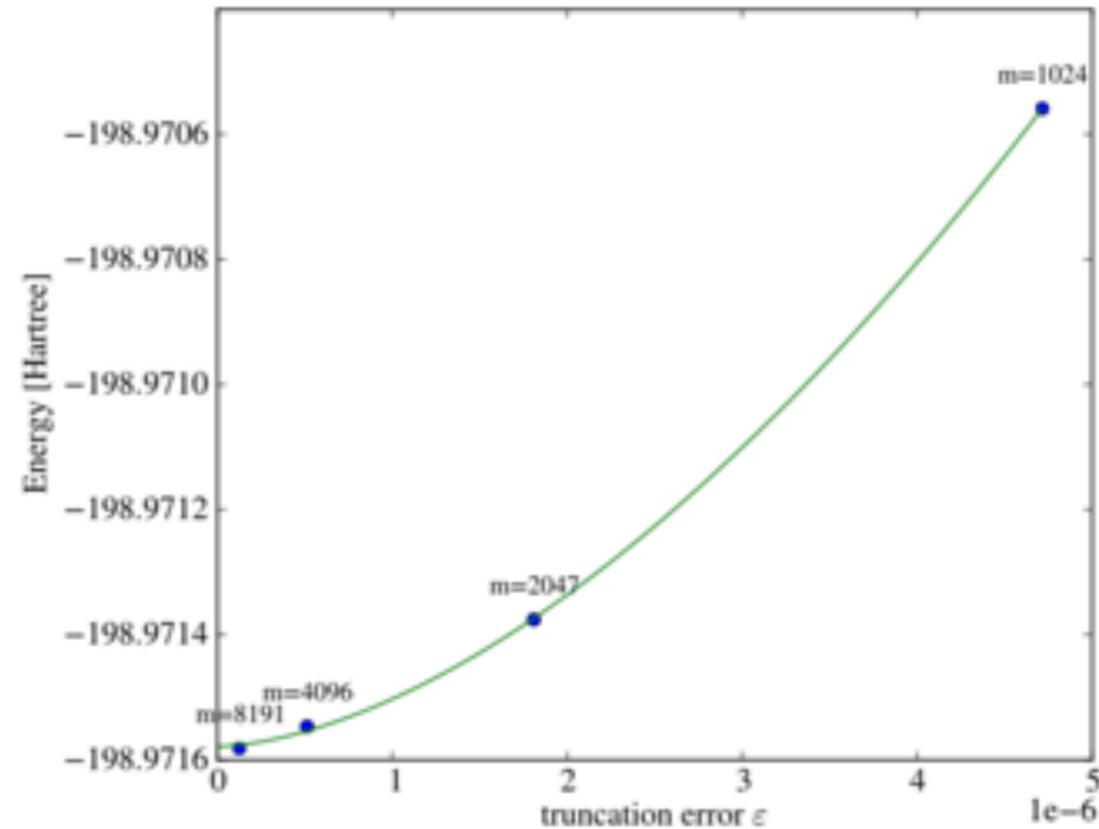
- **Scaling is dominated** by cost of contracting the operator with the MPS on one site and is proportional to the number of non-zero elements in the MPO matrices  $\{ \hat{W} \}$ 
  - in a naïve MPO ansatz this step scales as  $\mathcal{O}(L^5)$
  - in an optimized code scaling reduces to  $\mathcal{O}(L^4)$
- Further reduction through symmetry:  $U(1)$  and  $SU(2)$
- SVD scales as  $\mathcal{O}(m^3)$  (but there are  $L$  of them in a sweep)
- Taking into account all operations a sweep scales  $\approx \mathcal{O}(L^4 m^3)$

# Extrapolation

- Extrapolate  $E$  based on truncation error  $\epsilon$  for different values of  $m$

$$\ln \left( \frac{E_{\text{DMRG}} - E_{\text{FCI}}}{E_{\text{FCI}}} \right) = a \ln \epsilon + b$$

- Example: ground-state calculation of  $\text{F}_2$



# Determining factors of DMRG convergence

- Size  $L$  of the CAS
- Type of molecular orbitals (HF, NO's, localized orbitals, ...)
- MPS guess for the right subsystem (initial sweep)
- Ordering of orbitals (exploit quantum information / graph theory)
- Number of renormalized block states  $m$

**One should never calculate results for just a single  $m$ , but increase it in various runs until results converge!**

# Properties of DMRG

- Variational
  - Size-consistent
  - (approximate) FCI for a CAS
  - Polynomial scaling ( $\approx L^4 m^3$ )
  - MPS wave function
  - For large  $m$  invariant wrt orbital rotations
- Variational
  - Size-consistent
  - FCI for a CAS
  - Factorial scaling
  - Linearly parametrised wave function
  - Invariant wrt orbital rotations

# (Incomplete) List of DMRG codes for QC

- Budapest-DMRG code (Matlab, no source code available)
- MOLMPS (C++, ?)
- (Stack)Block and Block2 (C++, source code available)
- CheMPS2 (C++, Fortran, source code available)
- QCMaquis (C++, Fortran, source code available)
- ...

# Other classical methods for large CAS

- FCI-Quantum Monte Carlo aka FCIQMC
- Heat-Bath CI (aka SHCI)
- selective CI / CIPSI-like approaches
- v(ariational) 2RDM
- ...

—> Extensions to treat dynamical electron correlation available!

# The road ahead ...



# Thinking outside the box II

## Standard CI approach

- CI-type diagonalization for a **preselected** set of many-particle basis states

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

**DMRG**

- **Determine** CI coefficients from correlations among orbitals

$$|\Psi\rangle = \sum_{k_1, k_2, \dots, k_L} c_{k_1, k_2, \dots, k_L} |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

## Quantum Computing

- **“Learn”** the energy

$$\langle \Psi | \hat{H}_e | \Psi \rangle = \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

using an entangled set of qubits

$$|\Psi\rangle = \mathbf{U}(\vec{\theta}) |k_1\rangle \otimes |k_2\rangle \otimes \dots \otimes |k_L\rangle$$

# Quantum Chemistry on a Quantum Computer: Concepts and Challenges

# Some important references

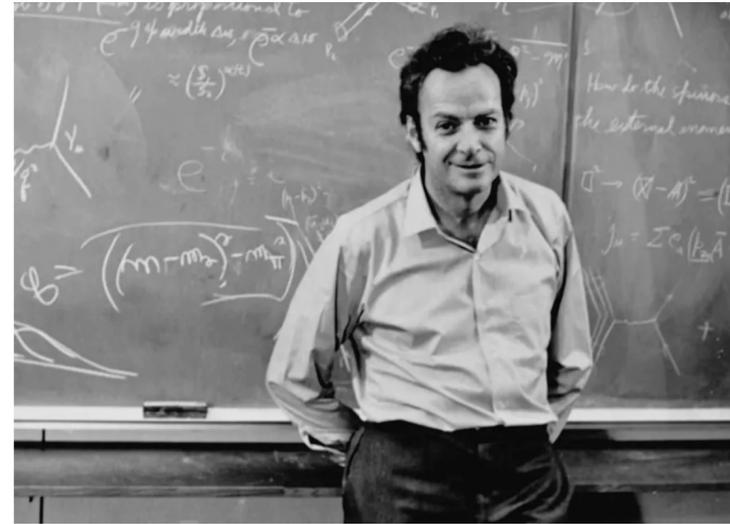
- Quantum Chemistry in the Age of Quantum Computing  
Aspuru-Guzik *et al.*, Chem. Rev. **119**, 10856 (2019)
- Quantum computational chemistry  
McArdle, Endo, Aspuru-Guzik, Benjamin, Yuan, Rev. Mod. Phys. **92**, 015003 (2020)
- An adaptive variational algorithm for exact molecular simulations on a quantum computer  
Grimsley, Economou, Barnes, Mayhall, Nat. Comm. **10**, 3007 (2019)
- Simulated Quantum Computation of Molecular Energies,  
Aspuru-Guzik, Dutoi, Love, Head-Gordon, Science **309**, 1704 (2005)
- Quantum chemistry, classical heuristics, and quantum advantage,  
Garnet Kin-Lic Chan, Faraday Discuss., 2024, doi: 10.1039/D4FD00141A

# The origins of quantum computing

## Simulating quantum physics



Yuri Manin  
1980



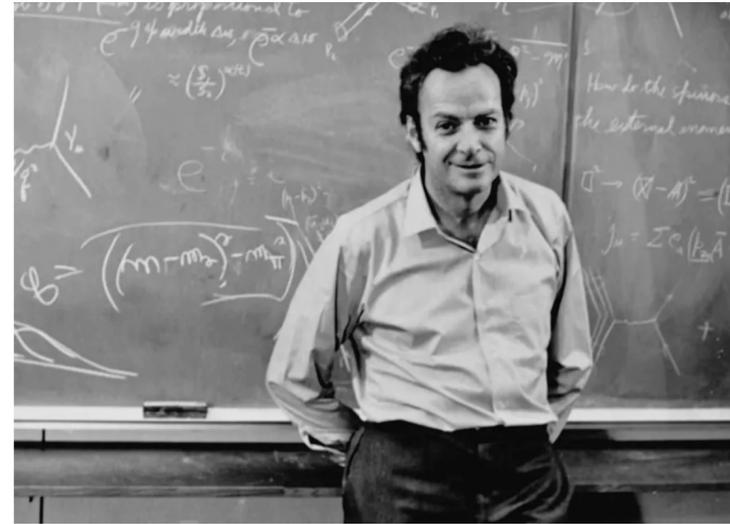
Richard Feynman  
1982

# The origins of quantum computing

## Simulating quantum physics



Yuri Manin  
1980



Richard Feynman  
1982

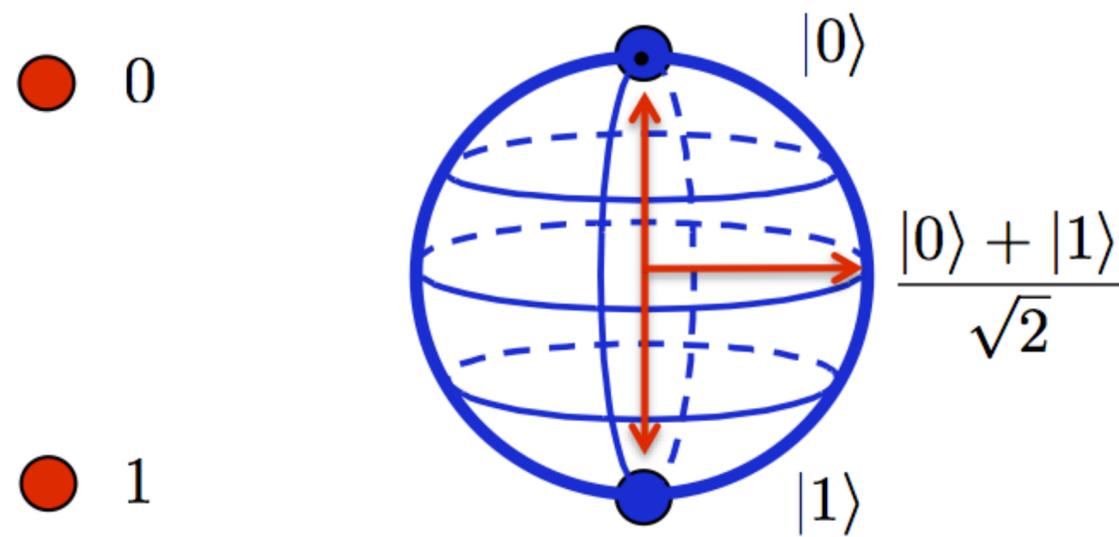
Simulating some quantum mechanical effects on a classical computer is unfeasible



Use a quantum one!

# The origins of quantum computing

## Simulating quantum physics



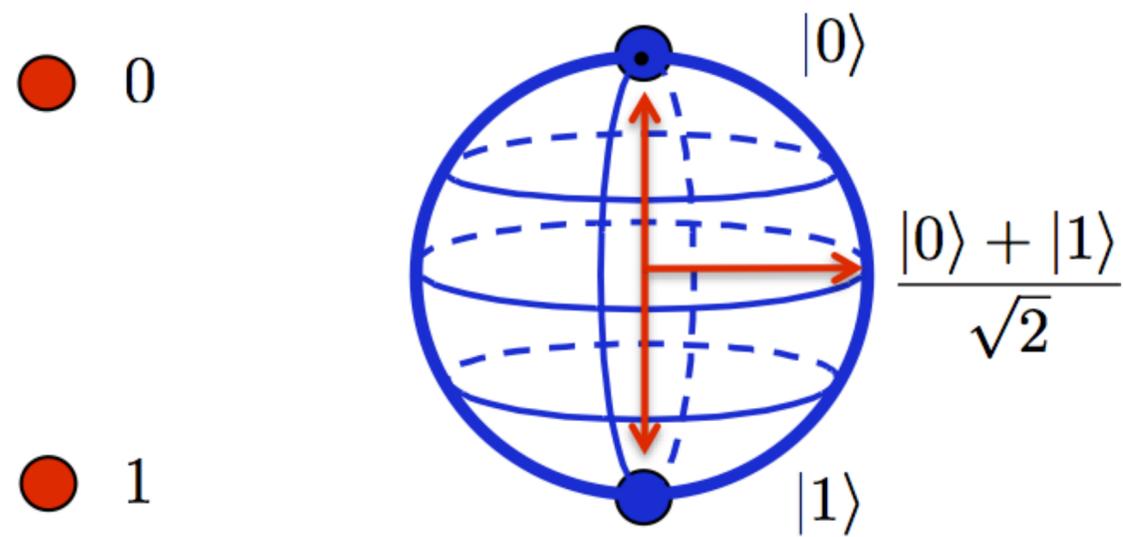
- Classical bit can be **either** in state  $|0\rangle$  **or** state  $|1\rangle$
- Qubit can be in a **superposition** of both states

$$|\psi\rangle = \alpha |0\rangle + \beta |1\rangle \equiv \alpha \begin{bmatrix} 1 \\ 0 \end{bmatrix} + \beta \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$

From **bits** to ...  $\longrightarrow$  **qubits**

# The origins of quantum computing

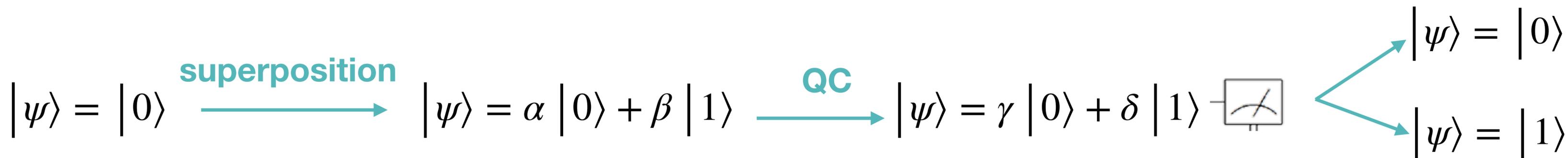
## Simulating quantum physics



- Classical bit can be **either** in state  $|0\rangle$  **or** state  $|1\rangle$
- Qubit can be in a **superposition** of both states

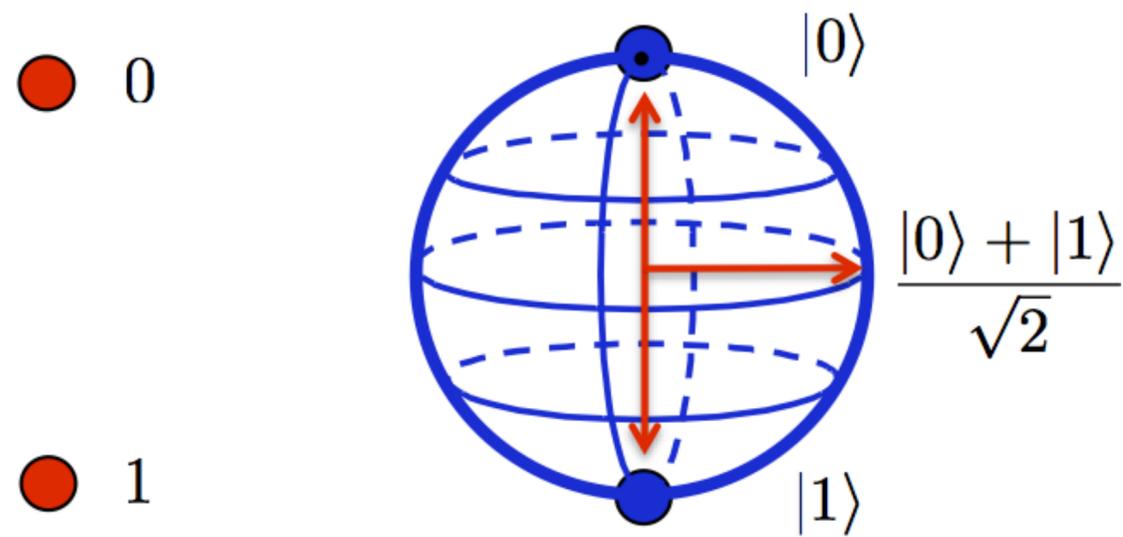
$$|\psi\rangle = \alpha |0\rangle + \beta |1\rangle \equiv \alpha \begin{bmatrix} 1 \\ 0 \end{bmatrix} + \beta \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$

From **bits** to ...  $\longrightarrow$  **qubits**



# The origins of quantum computing

## Simulating quantum physics



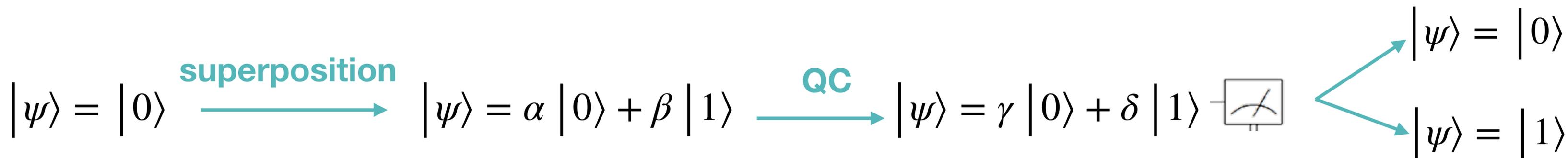
- Classical bit can be **either** in state  $|0\rangle$  **or** state  $|1\rangle$
- Qubit can be in a **superposition** of both states

$$|\psi\rangle = \alpha |0\rangle + \beta |1\rangle \equiv \alpha \begin{bmatrix} 1 \\ 0 \end{bmatrix} + \beta \begin{bmatrix} 0 \\ 1 \end{bmatrix}$$

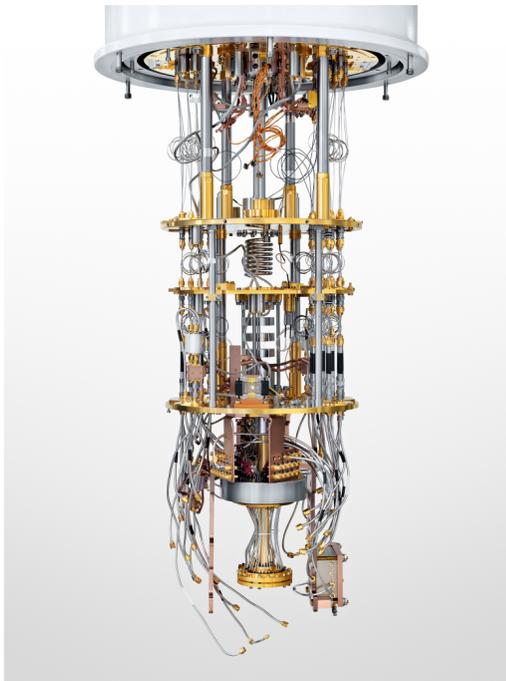
From **bits** to ...  $\longrightarrow$  **qubits**

- Measuring the state of the qubit with probability  $P$

$$P(|\psi\rangle = |0\rangle) = \gamma^2 \text{ and } P(|\psi\rangle = |1\rangle) = \delta^2$$



# Using a quantum computer as a quantum physics simulator

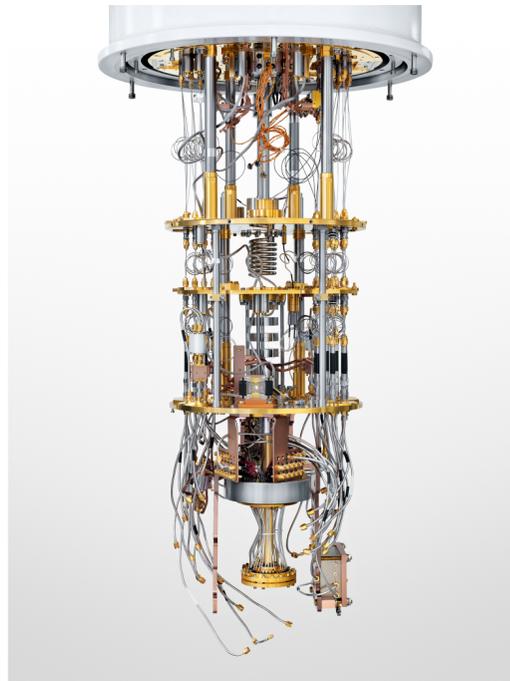


Arbitrary state of its qubits

↓

→  $|\Psi\rangle = \sum_{\vec{f}} \alpha_{\vec{f}} |f_1 f_2 \dots f_M\rangle$

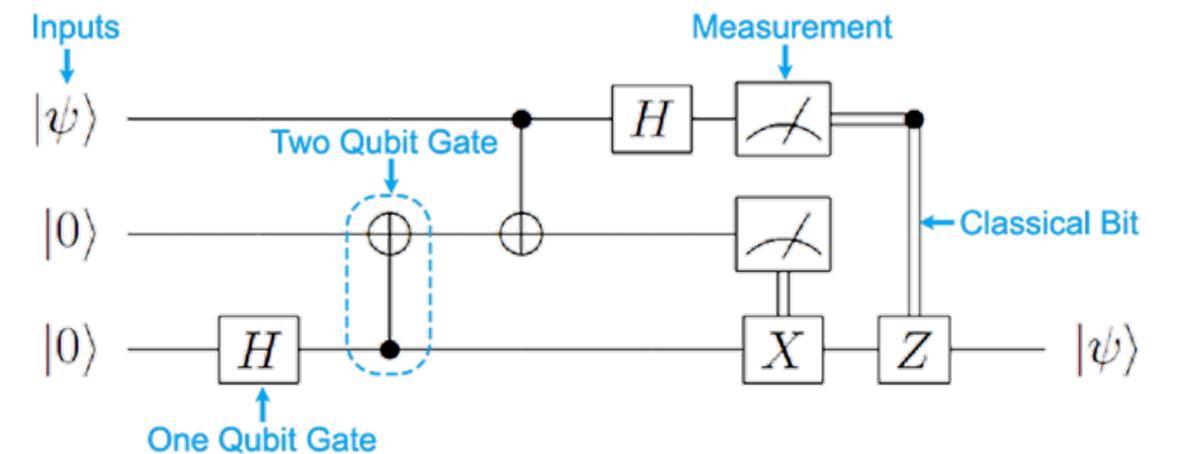
# Using a quantum computer as a quantum physics simulator



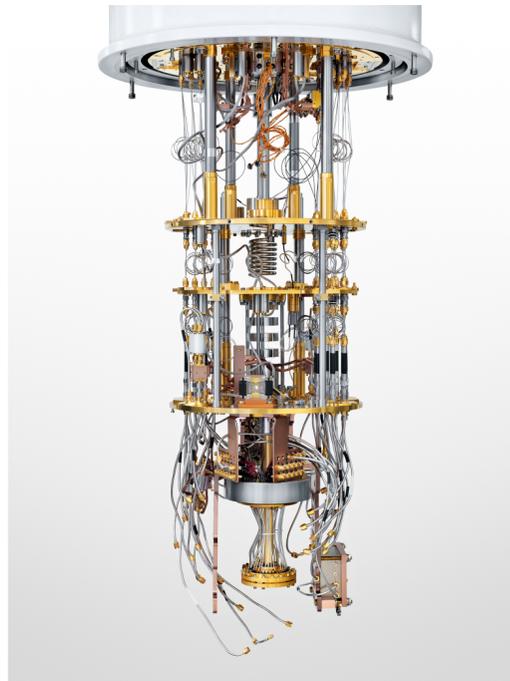
Arbitrary state of its qubits

$$\rightarrow |\Psi\rangle = \sum_{\vec{f}} \alpha_{\vec{f}} |f_1 f_2 \dots f_M\rangle \rightarrow$$

A universal quantum computer can solve problems beyond quantum simulation (e.g. factorisation)



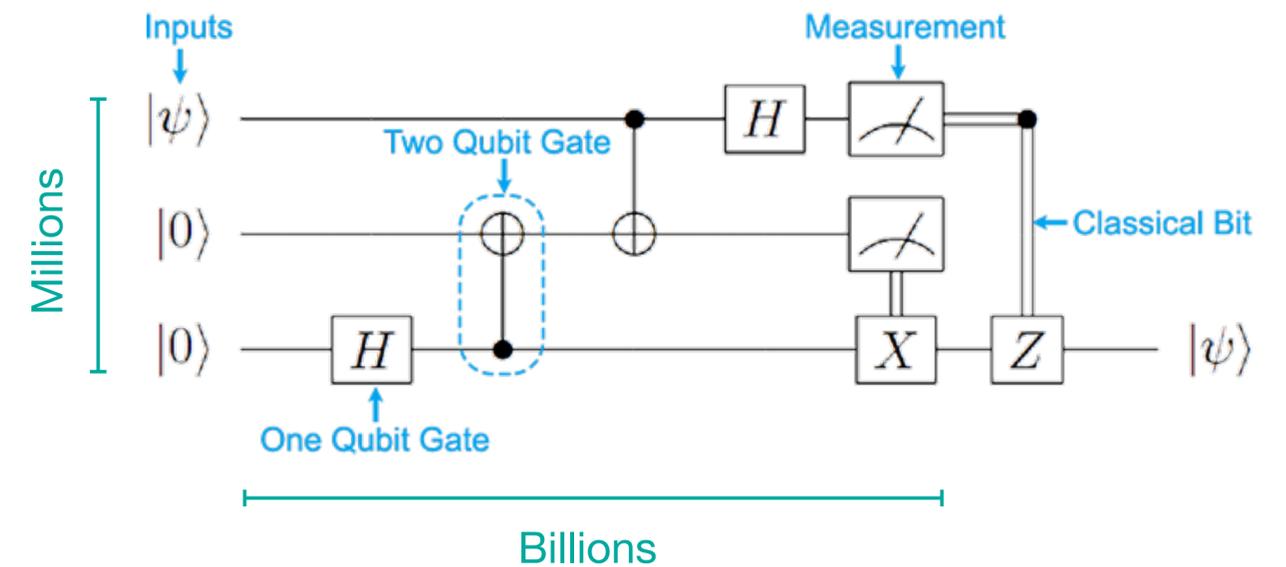
# Using a quantum computer as a quantum physics simulator



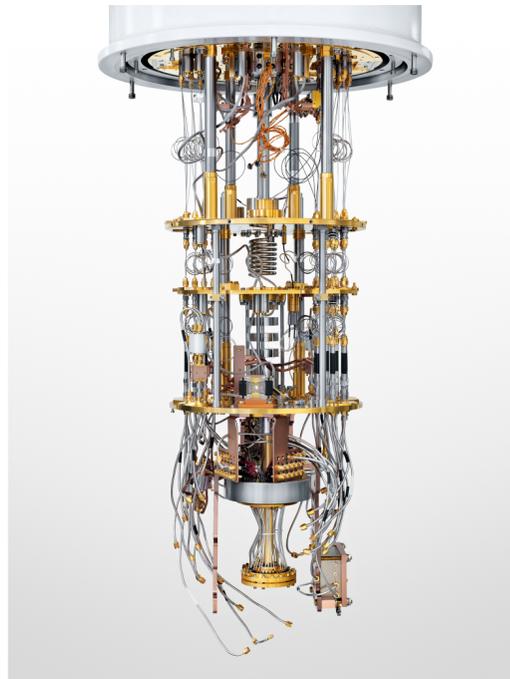
Arbitrary state of its qubits

$$\rightarrow |\Psi\rangle = \sum_{\vec{f}} \alpha_{\vec{f}} |f_1 f_2 \dots f_M\rangle \rightarrow$$

A universal quantum computer can solve problems beyond quantum simulation (e.g. factorisation)



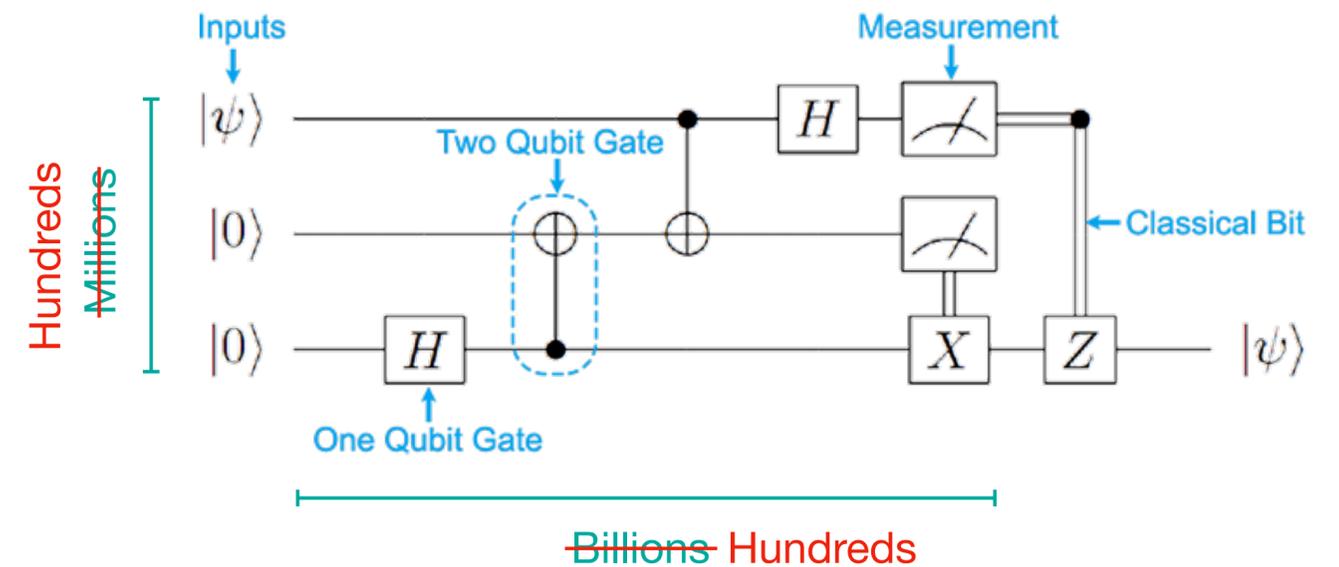
# Using a quantum computer as a quantum physics simulator



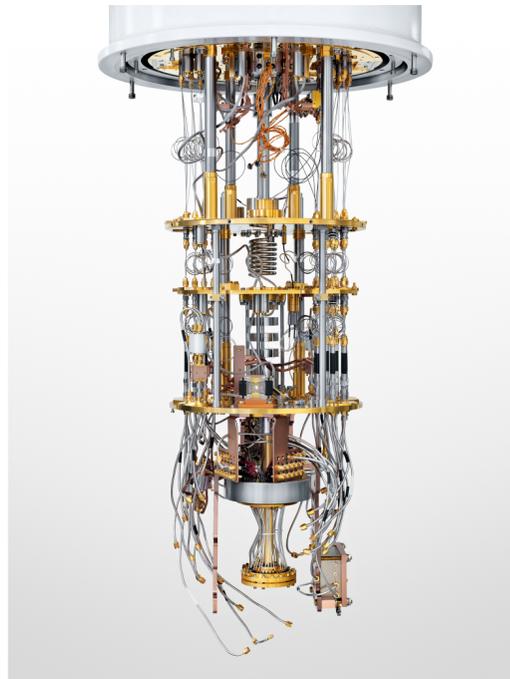
Arbitrary state of its qubits

$$\rightarrow |\Psi\rangle = \sum_{\vec{f}} \alpha_{\vec{f}} |f_1 f_2 \dots f_M\rangle \rightarrow$$

A universal quantum computer can solve problems beyond quantum simulation (e.g. factorisation)



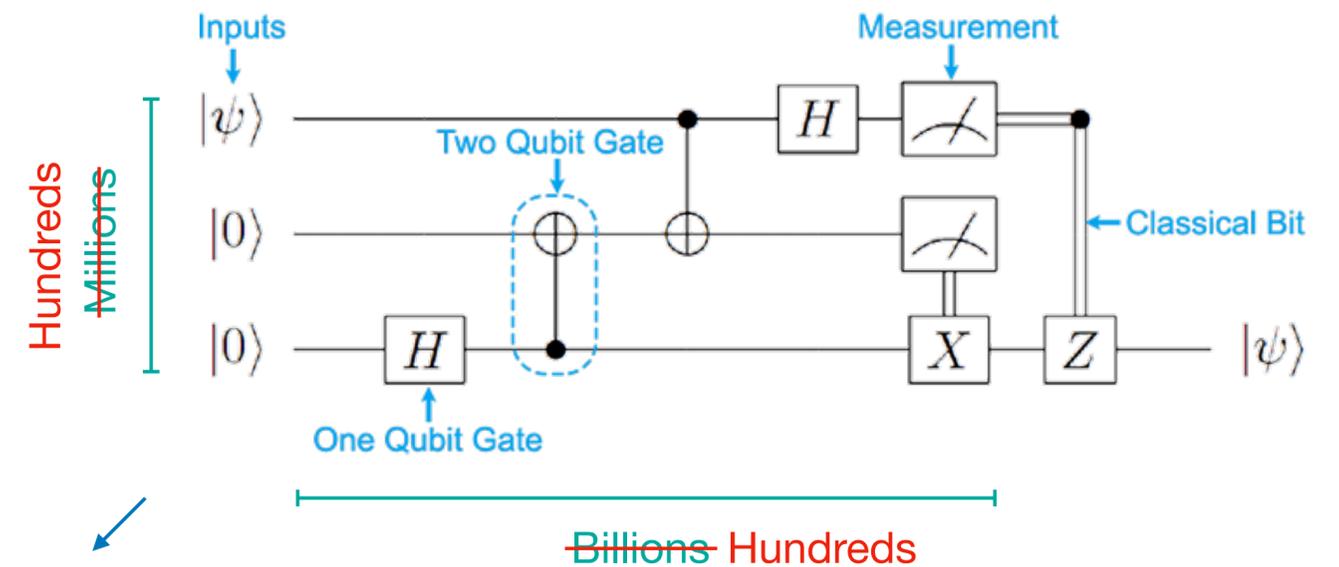
# Using a quantum computer as a quantum physics simulator



Arbitrary state of its qubits

$$\rightarrow |\Psi\rangle = \sum_{\vec{f}} \alpha_{\vec{f}} |f_1 f_2 \dots f_M\rangle \rightarrow$$

A universal quantum computer can solve problems beyond quantum simulation (e.g. factorisation)



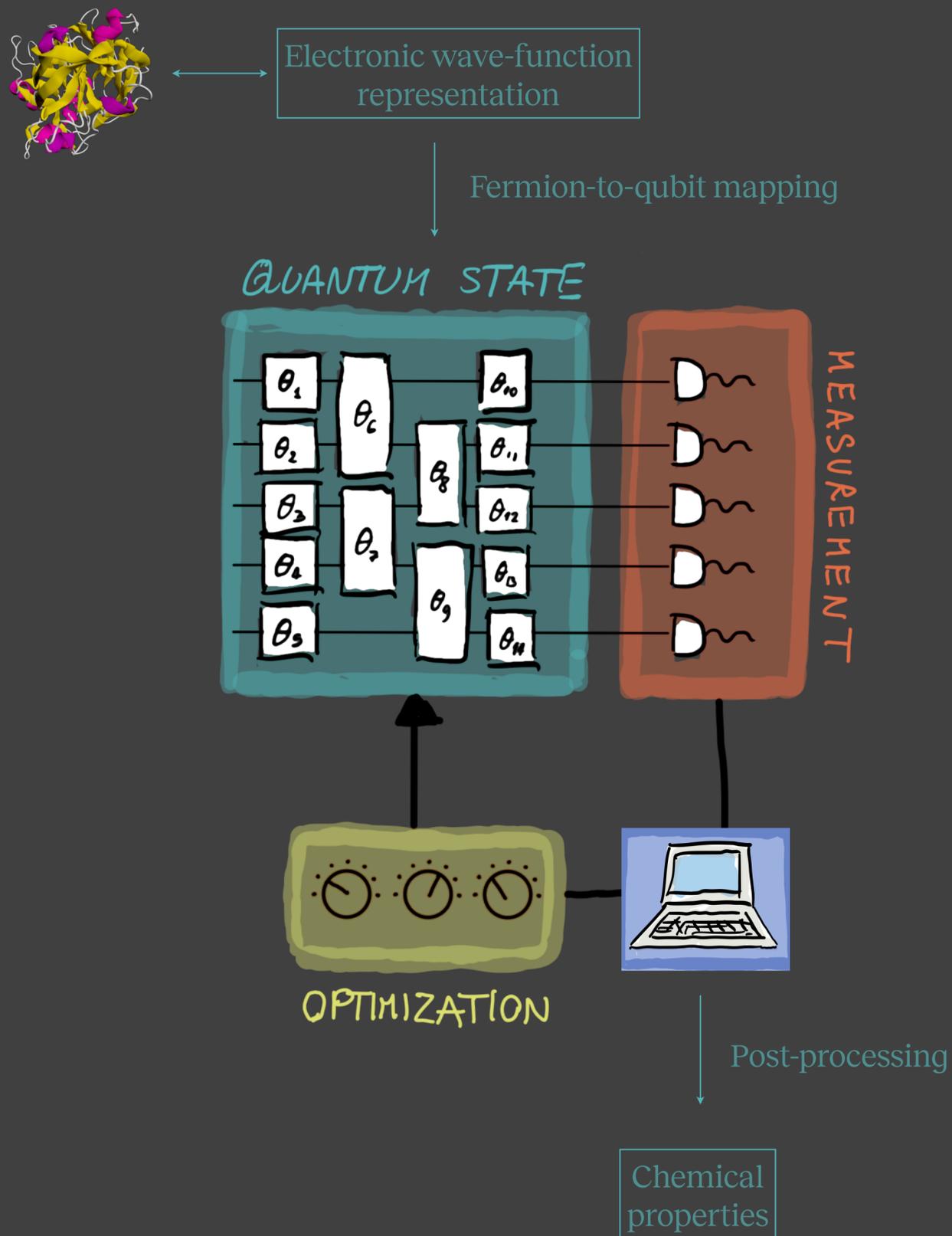
We are in the era of the Noisy Intermediate-Scale Quantum computers: soon useful for simulation!

Quantum 5, 433 (2021)

# Quantum computer technologies

Qubit Type	Pros/Cons	Select Players
Superconducting	<b>Pros:</b> High gate speeds and fidelities. Can leverage standard lithographic processes. Among first qubit modalities so has a head start.	
	<b>Cons:</b> Requires cryogenic cooling; short coherence times; microwave interconnect frequencies still not well understood.	
Trapped Ions	<b>Pros:</b> Extremely high gate fidelities and long coherence times. Extreme cryogenic cooling not required. Ions are perfect and consistent.	
	<b>Cons:</b> Slow gate times/operations and low connectivity between qubits. Lasers hard to align and scale. Ultra-high vacuum required. Ion charges may restrict scalability.	
Photonics	<b>Pros:</b> Extremely fast gate speeds and promising fidelities. No cryogenics or vacuums required. Small overall footprint. Can leverage existing CMOS fabs.	
	<b>Cons:</b> Noise from photon loss; each program requires its own chip. Photons don't naturally interact so 2Q gate challenges.	
Neutral Atoms	<b>Pros:</b> Long coherence times. Atoms are perfect and consistent. Strong connectivity, including more than 2Q. External cryogenics not required.	
	<b>Cons:</b> Requires ultra-high vacuums. Laser scaling challenging.	
Silicon Spin/Quantum Dots	<b>Pros:</b> Leverages existing semiconductor technology. Strong gate fidelities and speeds.	
	<b>Cons:</b> Requires cryogenics. Only a few entangled gates to-date with low coherence times. Interference/cross-talk challenges.	

Source: Quantum Computing Modalities - A Qubit Primer Revisited - The Quantum Leap (quantum tech.blog)

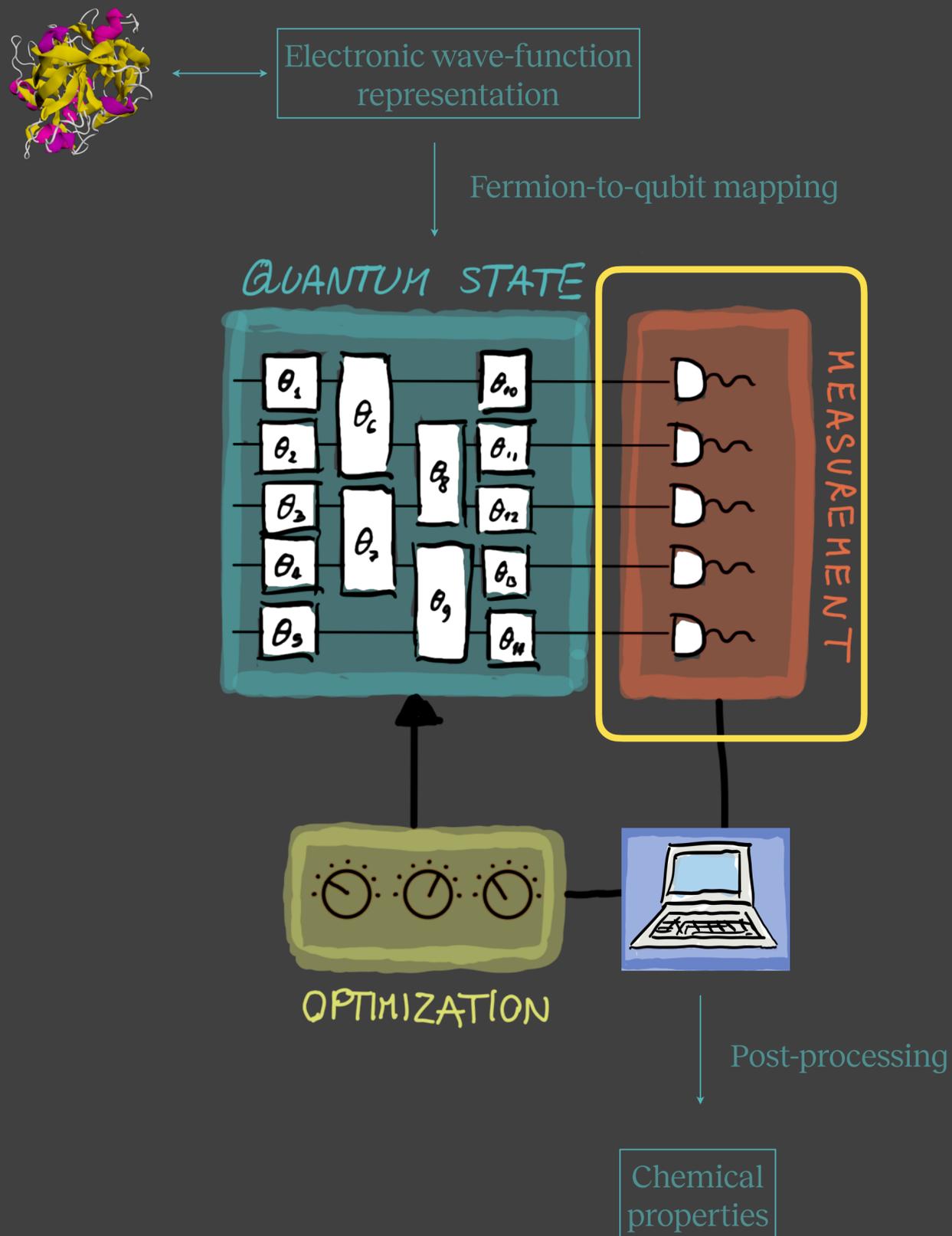


# Quantum Computing for Quantum Chemistry in a Nutshell

The state of the quantum processor mathematically **represents** the state of the molecule

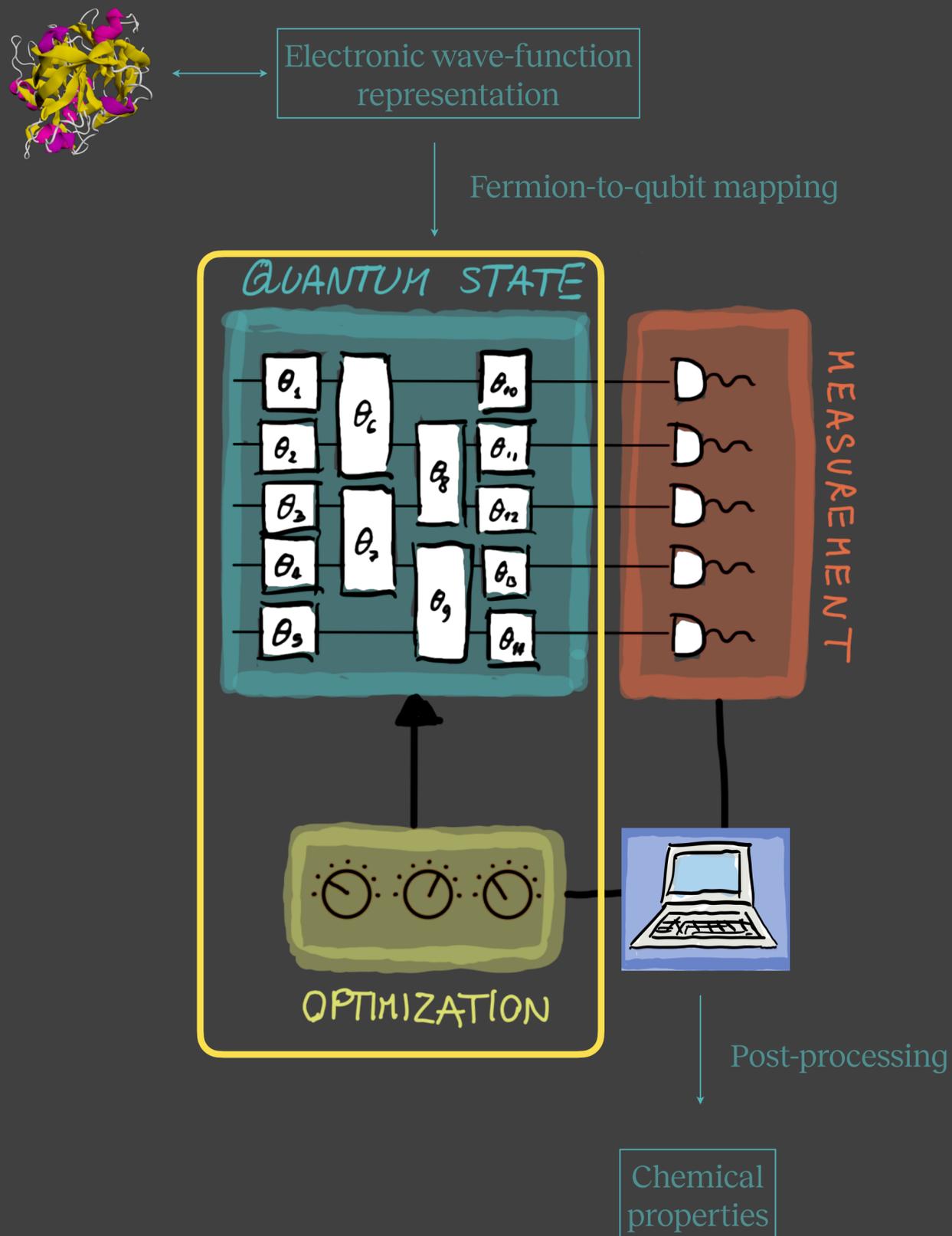
The goal is to find the state of the molecule for which the **energy is minimal**

The energy of the molecule needs to be **measured**



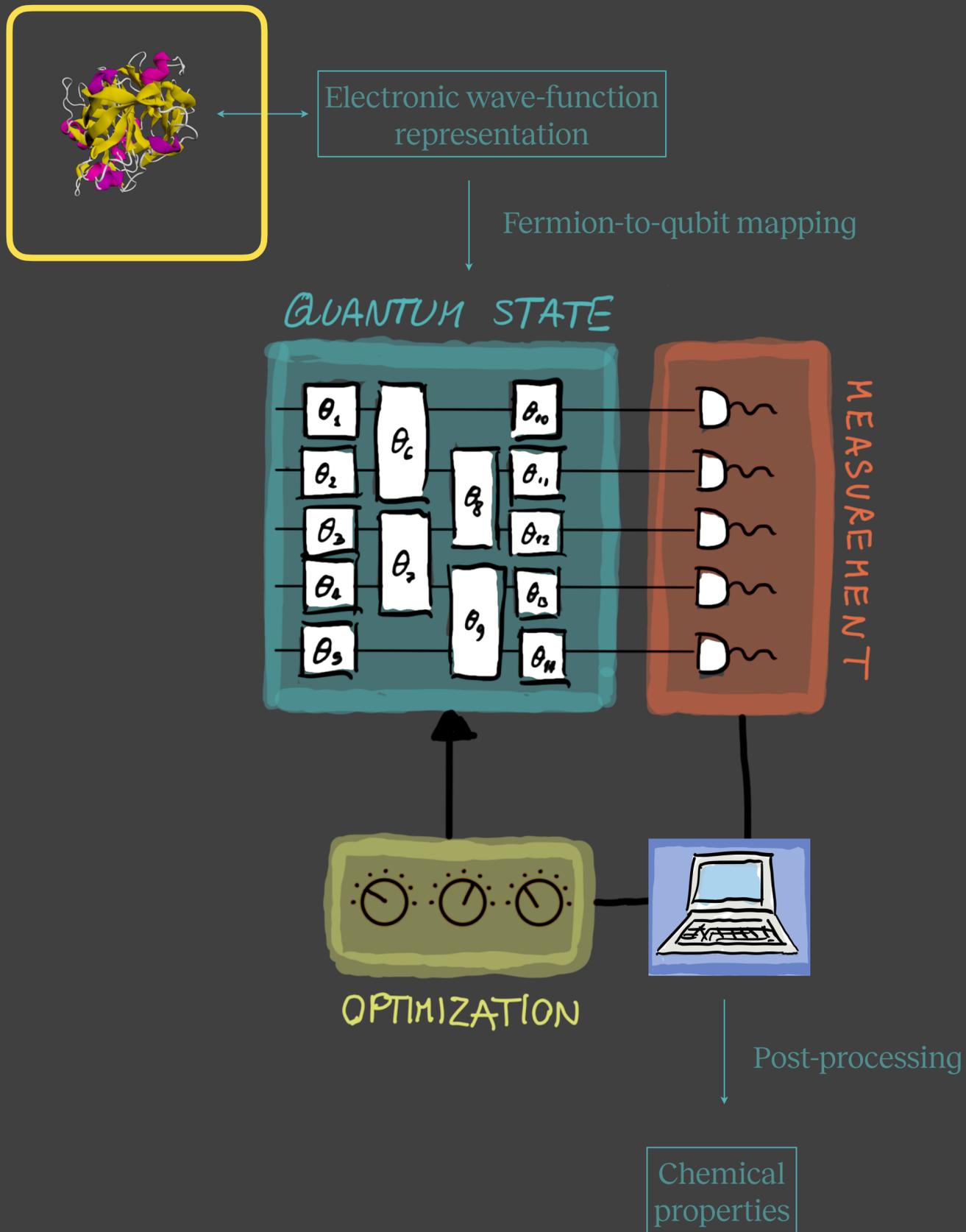
## Challenges in near-term QC

1. Measurement stage is time-consuming
2. Hilbert space is a big space
3. Qubits are a scarce resource
4. Noise biases the results
5. Resource efficient/aware representation



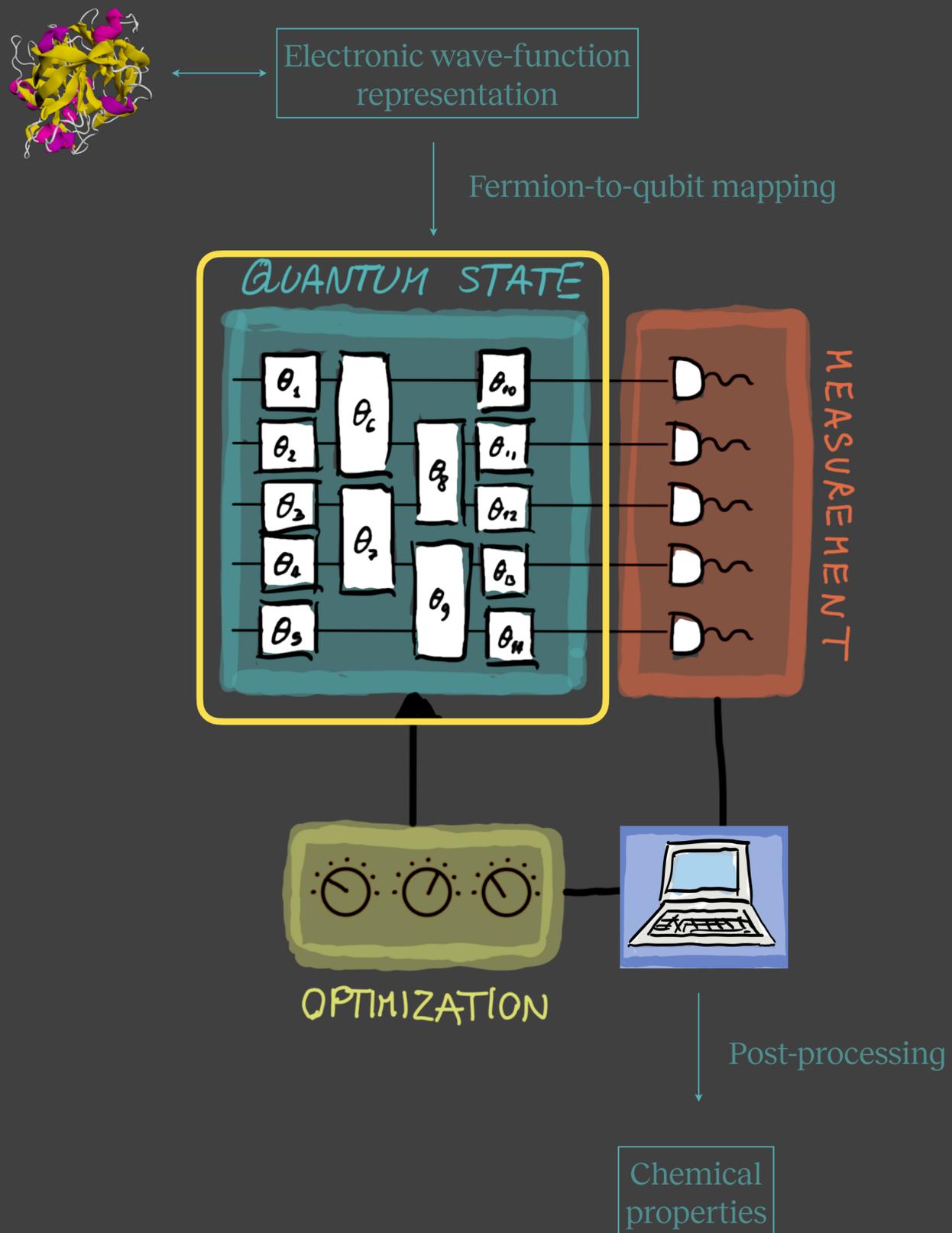
## Challenges in near-term QC

1. Measurement stage is time-consuming
2. Hilbert space is a big space
3. Qubits are a scarce resource
4. Noise biases the results
5. Resource efficient/aware representation



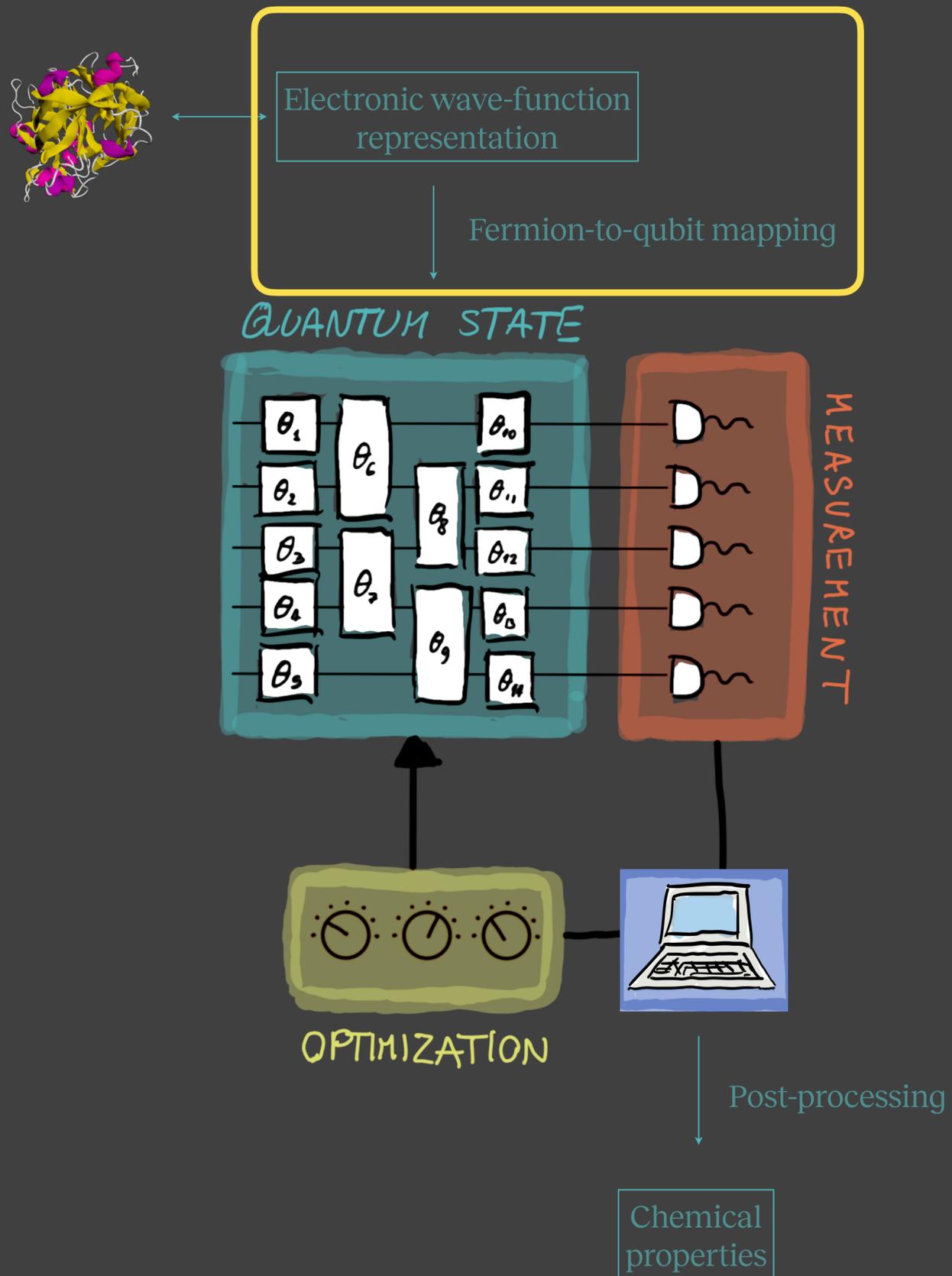
## Challenges in near-term QC

1. Measurement stage is time-consuming
2. Hilbert space is a big space
3. Qubits are a scarce resource
4. Noise biases the results
5. Resource efficient/aware representation



## Challenges in near-term QC

1. Measurement stage is time-consuming
2. Hilbert space is a big space
3. Qubits are a scarce resource
4. Noise biases the results
5. Resource efficient/aware representation



## Challenges in near-term QC

1. Measurement stage is time-consuming
2. Hilbert space is a big space
3. Qubits are a scarce resource
4. Noise biases the results
5. Resource efficient/aware representation

Mapping “the problem” from  
fermion to qubit space

# Mapping the problem from fermion to qubit space

## General considerations

- $N$ -electron wave function

$$|\Psi\rangle = \sum_{\zeta} c_{\zeta} |\Phi_{\zeta}\rangle \longrightarrow |\Psi\rangle$$

- Second-quantized Hamiltonian

$$\hat{H}_e = \sum_{p,q} h_{pq} \hat{E}_{pq} + \frac{1}{2} \sum_{p,q,r,s} (pq|rs) \left( \hat{E}_{pq} \hat{E}_{rs} - \delta_{qr} \hat{E}_{ps} \right) \longrightarrow ?$$

- Fermions are indistinguishable particles, qubits are distinguishable  
—> we need to account for anti-commutation of fermionic operators in the map!

$$\{\hat{a}_p, \hat{a}_q\} = 0 \quad \{\hat{a}_p^{\dagger}, \hat{a}_q^{\dagger}\} = 0 \quad \{\hat{a}_p, \hat{a}_q^{\dagger}\} = \delta_{pq}$$

# Mapping the problem from fermion to qubit space

$N$ -electron wave function

$$|\Psi\rangle = \sum_{\mathbf{f}} c_{\mathbf{f}} |f_{M-1} \cdots f_1 f_0\rangle$$

Exact for infinite  $M$ !

# Mapping the problem from fermion to qubit space

$N$ -electron wave function

$$|\Psi\rangle = \sum_{\mathbf{f}} c_{\mathbf{f}} |f_{M-1} \cdots f_1 f_0\rangle$$

Exact for infinite  $M$ !

- Trivial interaction of fermionic creation/annihilation operators on ON

$$\hat{a}_p^\dagger |f_{M-1} \cdots f_{p+1} \ 0 \ f_{p-1} \cdots f_0\rangle = (-1)^{\sum_{s=0}^{p-1} f_s} |f_{M-1} \cdots f_{p+1} \ 1 \ f_{p-1} \cdots f_0\rangle$$

$$\hat{a}_p^\dagger |f_{M-1} \cdots f_{p+1} \ 1 \ f_{p-1} \cdots f_0\rangle = 0$$

$$\hat{a}_p |f_{M-1} \cdots f_{p+1} \ 1 \ f_{p-1} \cdots f_0\rangle = (-1)^{\sum_{s=0}^{p-1} f_s} |f_{M-1} \cdots f_{p+1} \ 0 \ f_{p-1} \cdots f_0\rangle$$

$$\hat{a}_p |f_{M-1} \cdots f_{p+1} \ 0 \ f_{p-1} \cdots f_0\rangle = 0$$

# Mapping the problem from fermion to qubit space

## $N$ -electron wave function

- Trivial translation of fermionic ON vector basis to qubit ON vector basis

$$|f_{M-1} \cdots f_1 f_0\rangle \longrightarrow |q_{M-1}\rangle \cdots \otimes |q_1\rangle \otimes |q_0\rangle \equiv |q_{M-1} \cdots q_1 q_0\rangle$$

- What about creation/annihilation operators for qubits?

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Use a simple recipe for one-qubit creation and annihilation operators?

$$\hat{Q}^+ |1\rangle = 0 \quad \hat{Q}^+ |0\rangle = |1\rangle \quad \hat{Q}^- |1\rangle = |0\rangle \quad \hat{Q}^- |0\rangle = 0$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Use a simple recipe for one-qubit creation and annihilation operators?

$$\hat{Q}^+ |1\rangle = 0 \quad \hat{Q}^+ |0\rangle = |1\rangle \quad \hat{Q}^- |1\rangle = |0\rangle \quad \hat{Q}^- |0\rangle = 0$$



Do not obey the fermionic anti-commutation relations!

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Use a simple recipe for one-qubit creation and annihilation operators?

$$\hat{Q}^+ |1\rangle = 0 \quad \hat{Q}^+ |0\rangle = |1\rangle \quad \hat{Q}^- |1\rangle = |0\rangle \quad \hat{Q}^- |0\rangle = 0$$



Do not obey the fermionic anti-commutation relations!

- Better ansatz? Form operators based on Pauli matrices!

$$\hat{Q}^+ = |1\rangle\langle 0| \equiv \frac{1}{2} (\sigma_x - i\sigma_y) = \frac{1}{2} (X - iY)$$

$$\hat{Q}^- = |0\rangle\langle 1| \equiv \frac{1}{2} (\sigma_x + i\sigma_y) = \frac{1}{2} (X + iY)$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Why are Pauli matrices a suitable choice?

$$\sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \quad \sigma_y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix} \quad \sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Why are Pauli matrices a suitable choice?

**Single-qubit quantum gates are  $2 \times 2$  unitary matrices**

$$\sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \quad \sigma_y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix} \quad \sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Why are Pauli matrices a suitable choice?

### Single-qubit quantum gates are $2 \times 2$ unitary matrices

—> Pauli matrices are  $2 \times 2$  Hermitian (unitary) matrices

—> Pauli matrices are involutory:  $\sigma_p^2 = \mathbf{1} \quad \forall p \in [x, y, z]$

—> Pauli matrices anti-commute:  $\left\{ \sigma_p, \sigma_q \right\} = 2I\delta_{pq} \quad \forall p, q \in [x, y, z]$

$$\sigma_x = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix} \quad \sigma_y = \begin{pmatrix} 0 & -i \\ i & 0 \end{pmatrix} \quad \sigma_z = \begin{pmatrix} 1 & 0 \\ 0 & -1 \end{pmatrix}$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Because of anti-commutation among Paulis,  $\hat{Q}^\pm$  and  $\sigma_z$  anti-commute
- Represent action of fermionic operators  $\hat{a}_p^{(\dagger)}$  for index  $p$  by acting with  $\hat{Q}^\pm$  on qubit  $p$  and with  $\sigma_z$  on all qubits with index  $q < p$  and with the identity  $\mathbf{1}$  on the remaining qubits

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Because of anti-commutation among Paulis,  $\hat{Q}^\pm$  and  $\sigma_z$  anti-commute
- Represent action of fermionic operators  $\hat{a}_p^{(\dagger)}$  for index  $p$  by acting with  $\hat{Q}^\pm$  on qubit  $p$  and with  $\sigma_z$  on all qubits with index  $q < p$  and with the identity  $\mathbf{1}$  on the remaining qubits

$$\hat{a}_p^\dagger \equiv \mathbf{1}^{\otimes M-p-1} \otimes \hat{Q}_p^+ \otimes [\sigma_z^{\otimes p}] = \frac{1}{2} \left( X_p \otimes [\sigma_z^{\otimes p}] - iY_p \otimes [\sigma_z^{\otimes p}] \right)$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

- Because of anti-commutation among Paulis,  $\hat{Q}^\pm$  and  $\sigma_z$  anti-commute
- Represent action of fermionic operators  $\hat{a}_p^{(\dagger)}$  for index  $p$  by acting with  $\hat{Q}^\pm$  on qubit  $p$  and with  $\sigma_z$  on all qubits with index  $q < p$  and with the identity  $\mathbf{1}$  on the remaining qubits

$$\hat{a}_p^\dagger \equiv \mathbf{1}^{\otimes M-p-1} \otimes \hat{Q}_p^+ \otimes [\sigma_z^{\otimes p}] = \frac{1}{2} \left( X_p \otimes [\sigma_z^{\otimes p}] - iY_p \otimes [\sigma_z^{\otimes p}] \right)$$

$$\hat{a}_p \equiv \mathbf{1}^{\otimes M-p-1} \otimes \hat{Q}_p^- \otimes [\sigma_z^{\otimes p}] = \frac{1}{2} \left( X_p \otimes [\sigma_z^{\otimes p}] + iY_p \otimes [\sigma_z^{\otimes p}] \right)$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

Major drawback of Jordan-Wigner mapping:  **$k$ -locality!**

**$k$ -locality: each term in the Hamiltonian acts non-trivially on at most  $k$  qubits**

—> non-locality of “parity term  $[\sigma_z^{\otimes p}]$ ” that appears in  $\hat{a}_p^{(\dagger)}$  introduces a number of extra qubit operations which scale as  $\mathcal{O}(M)$ !

**Example**: how does it work for mapping one-electron terms

$$\hat{h} = \sum_{pq} h_{pq} \hat{a}_p^\dagger \hat{a}_q ?$$

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

```
> from qiskit_nature.converters.second_quantization import QubitConverter...
fcac = np.zeros((2, 2), dtype=float)
fcac[0][0] = 1.0; fcac[1][1] = 3.0

h2ac = np.zeros((2, 2, 2, 2), dtype=float)
> one_body_ints = OneBodyElectronicIntegrals(...)

> two_body_ints = TwoBodyElectronicIntegrals(...)
qc_ham_qiskit = ElectronicEnergy([one_body_ints, two_body_ints])
fermi_ham = qc_ham_qiskit.second_q_ops()[0]
fermi_ham.set_truncation(0)
• print("Fermionic Hamiltonian",fermi_ham)
qubit_converter = QubitConverter(mapper=JordanWignerMapper())
Hq = qubit_converter.convert(fermi_ham)
print("J-W Qubit Hamiltonian",Hq)

✓ 0.4s

Fermionic Hamiltonian Fermionic Operator
register length=4, number terms=5
  1.0 * ( +_0 -_0 )
+ 3.0 * ( +_1 -_1 )
+ 1.0 * ( +_2 -_2 )
+ 3.0 * ( +_3 -_3 )
+ 0j
J-W Qubit Hamiltonian 4.0 * IIII
- 0.5 * IIIZ
- 1.5 * IIZI
- 0.5 * IZII
- 1.5 * ZIII
```

# Mapping the problem from fermion to qubit space

## Jordan-Wigner mapping

```
> from qiskit_nature.converters.second_quantization import QubitConverter...
fcac = np.zeros((2, 2), dtype=float)
fcac[0][0] = 1.0; fcac[1][1] = 3.0

h2ac = np.zeros((2, 2, 2, 2), dtype=float)
> one_body_ints = OneBodyElectronicIntegrals(...)

> two_body_ints = TwoBodyElectronicIntegrals(...)
qc_ham_qiskit = ElectronicEnergy([one_body_ints, two_body_ints])
fermi_ham = qc_ham_qiskit.second_q_ops()[0]
```

Could we avoid to operate with  $\sigma_z$  on all qubits  $q$  with

$$q < p?$$

```
Fermionic Hamiltonian Fermionic operator
register length=4, number terms=5
 1.0 * ( +_0 -_0 )
+ 3.0 * ( +_1 -_1 )
+ 1.0 * ( +_2 -_2 )
+ 3.0 * ( +_3 -_3 )
+ 0j
J-W Qubit Hamiltonian 4.0 * IIII
- 0.5 * IIIZ
- 1.5 * IIZI
- 0.5 * IZII
- 1.5 * ZIII
```

# Mapping the problem from fermion to qubit space

## Parity mapping

- Alternative idea to occupation number basis  $\rightarrow$  parity basis:

Use qubit  $p$  to store the parity  $\mathcal{P}$  of all occupied orbitals up to  $p$

$$\mathcal{P}_p = \text{mod} \left( \sum_{s=0}^p f_s, 2 \right)$$

- Parity of set of orbitals with  $q < p$  determines whether  $\hat{a}_p^{(\dagger)}$  introduces a phase of -1

$\rightarrow$  it suffices to only have  $\sigma_z$  acting on qubit  $p - 1$

# Mapping the problem from fermion to qubit space

## Parity mapping

- BUT: we cannot represent the creation or annihilation of a particle in qubit  $q_p$  with  $\hat{Q}_p^{(\pm)}$  since  $q_p$  stores the parity of all orbitals with index  $q \leq p$
- Representing for example  $\hat{a}_p^\dagger$  in terms of  $\hat{Q}_p^\pm$  depends on qubit  $(p - 1)$ :
  - qubit  $(p - 1)$  is in state  $|0\rangle$ : act on qubit  $p$  with  $\hat{Q}_p^+$
  - qubit  $(p - 1)$  is in state  $|1\rangle$ : act on qubit  $p$  with  $\hat{Q}_p^-$

# Mapping the problem from fermion to qubit space

## Parity mapping

- Operator equivalent to  $\hat{Q}^\pm$  in parity basis is  $\hat{P}^\pm$  and a **two-qubit** operator!

$$\begin{aligned}\hat{P}_p^\pm &\equiv \hat{Q}_p^\pm \otimes |0\rangle\langle 0|_{p-1} - \hat{Q}_p^\mp \otimes |1\rangle\langle 1|_{p-1} \\ &= \frac{1}{2} \left( X_p \otimes Z_{p-1} \mp iY_p \right)\end{aligned}$$

# Mapping the problem from fermion to qubit space

## Parity mapping

- Operator equivalent to  $\hat{Q}^\pm$  in parity basis is  $\hat{P}^\pm$  and a **two-qubit** operator!

$$\begin{aligned}\hat{P}_p^\pm &\equiv \hat{Q}_p^\pm \otimes |0\rangle\langle 0|_{p-1} - \hat{Q}_p^\mp \otimes |1\rangle\langle 1|_{p-1} \\ &= \frac{1}{2} \left( X_p \otimes Z_{p-1} \mp iY_p \right)\end{aligned}$$

**Caution:** creating/annihilating a particle in  $p$  changes the parity to be stored in qubits with index greater  $p$ : apply  $\sigma_x$  to **all qubits**  $q_k$  **with**  $k > p$

# Mapping the problem from fermion to qubit space

## Parity mapping

- Operator equivalent to  $\hat{Q}^\pm$  in parity basis is  $\hat{P}^\pm$  and a **two-qubit** operator!

$$\begin{aligned}\hat{P}_p^\pm &\equiv \hat{Q}_p^\pm \otimes |0\rangle\langle 0|_{p-1} - \hat{Q}_p^\mp \otimes |1\rangle\langle 1|_{p-1} \\ &= \frac{1}{2} \left( X_p \otimes Z_{p-1} \mp iY_p \right)\end{aligned}$$

**Caution:** creating/annihilating a particle in  $p$  changes the parity to be stored in qubits with index greater  $p$ : apply  $\sigma_x$  to **all qubits**  $q_k$  **with**  $k > p$

$$\hat{a}_p^\dagger \equiv \left[ \sigma_x^{\otimes M-p} \right] \otimes \hat{P}_p^+ = \frac{1}{2} \left( \left[ \sigma_x^{\otimes M-p} \right] \otimes X_p \otimes Z_{p-1} - i \left[ \sigma_x^{\otimes M-p} \right] \otimes Y_p \right)$$

$$\hat{a}_p \equiv \left[ \sigma_x^{\otimes M-p} \right] \otimes \hat{P}_p^- = \frac{1}{2} \left( \left[ \sigma_x^{\otimes M-p} \right] \otimes X_p \otimes Z_{p-1} + i \left[ \sigma_x^{\otimes M-p} \right] \otimes Y_p \right)$$

# Mapping the problem from fermion to qubit space

## Parity mapping

- Major drawback of parity mapping:  **$k$ -locality!**
  - > non-locality of “update term  $\left[\sigma_x^{\otimes M-p}\right]$ ” that appears in  $\hat{a}_p^{(\dagger)}$  introduces a number of extra qubit operations which scale as  $\mathcal{O}(M)$ !

# Mapping the problem from fermion to qubit space

## Parity mapping

- Major drawback of parity mapping:  **$k$ -locality!**
  - > non-locality of “update term  $\left[\sigma_x^{\otimes M-p}\right]$ ” that appears in  $\hat{a}_p^{(\dagger)}$  introduces a number of extra qubit operations which scale as  $\mathcal{O}(M)$ !
- Trailing string of  $\sigma_z$  (J-W) replaced by leading string of  $\sigma_x$  ...

# Mapping the problem from fermion to qubit space

## Parity mapping

- Major drawback of parity mapping:  **$k$ -locality!**
  - > non-locality of “update term  $\left[\sigma_x^{\otimes M-p}\right]$ ” that appears in  $\hat{a}_p^{(\dagger)}$  introduces a number of extra qubit operations which scale as  $\mathcal{O}(M)$ !
- Trailing string of  $\sigma_z$  (J-W) replaced by leading string of  $\sigma_x$  ...
- **Example**: how does it work for mapping one-electron terms

$$\hat{h} = \sum_{pq} h_{pq} \hat{a}_p^\dagger \hat{a}_q ?$$

# Mapping the problem from fermion to qubit space

## Parity mapping

```
> from qiskit_nature.converters.second_quantization import QubitConverter...
fcac = np.zeros((2, 2), dtype=float)
fcac[0][0] = 1.0; fcac[1][1] = 3.0

h2ac = np.zeros((2, 2, 2, 2), dtype=float)
> one_body_ints = OneBodyElectronicIntegrals(...)

> two_body_ints = TwoBodyElectronicIntegrals(...)
qc_ham_qiskit = ElectronicEnergy([one_body_ints, two_body_ints])
fermi_ham = qc_ham_qiskit.second_q_ops()[0]
fermi_ham.set_truncation(0)
print("Fermionic Hamiltonian",fermi_ham)
qubit_converter = QubitConverter(mapper=ParityMapper())
Hq = qubit_converter.convert(fermi_ham)
print("Parity Qubit Hamiltonian",Hq)
```

✓ 0.4s

```
Fermionic Hamiltonian Fermionic Operator
register length=4, number terms=5
  1.0 * ( +_0 -_0 )
+ 3.0 * ( +_1 -_1 )
+ 1.0 * ( +_2 -_2 )
+ 3.0 * ( +_3 -_3 )
+ 0j
Parity Qubit Hamiltonian 4.0 * IIII
- 0.5 * IIIZ
- 1.5 * IIZZ
- 0.5 * IZZI
- 1.5 * ZZII
```

# Mapping the problem from fermion to qubit space

## Parity mapping

```
> from qiskit_nature.converters.second_quantization import QubitConverter...
fcac = np.zeros((2, 2), dtype=float)
fcac[0][0] = 1.0; fcac[1][1] = 3.0

h2ac = np.zeros((2, 2, 2, 2), dtype=float)
> one_body_ints = OneBodyElectronicIntegrals(...)

> two_body_ints = TwoBodyElectronicIntegrals(...)
qc_ham_qiskit = ElectronicEnergy([one_body_ints, two_body_ints])
fermi_ham = qc_ham_qiskit.second_q_ops()[0]
fermi_ham.set_truncation(0)
```

Could we avoid to to operate with  $\sigma_x$  on all qubits  $q$  with  
 $q > p$ ?

```
register length=4, number terms=5
 1.0 * ( +_0 -_0 )
+ 3.0 * ( +_1 -_1 )
+ 1.0 * ( +_2 -_2 )
+ 3.0 * ( +_3 -_3 )
+ 0j
Parity Qubit Hamiltonian 4.0 * IIII
- 0.5 * IIIZ
- 1.5 * IIZZ
- 0.5 * IZZI
- 1.5 * ZZII
```

# Mapping the problem from fermion to qubit space

## Notes on other mappings

- Major drawback of parity and J-W mapping:  **$k$ -locality which is also referred to as Pauli weight**
- Other more elaborate mappings exist which scale as  $\mathcal{O}(\log_2 M)$   
[Bravyi-Kitaev  $\rightarrow$  “combines ideas” of J-W and parity mappings] or even up to  $\mathcal{O}(\log_3 M)$

# Mapping the problem from fermion to qubit space

## Bravyi-Kitaev

```
qubit_converter = QubitConverter(mapper=JordanWignerMapper())  
Hq = qubit_converter.convert(fermi_ham)  
print("J-W Qubit Hamiltonian",Hq)
```

```
qubit_converter = QubitConverter(mapper=ParityMapper())  
Hq = qubit_converter.convert(fermi_ham)  
print("Parity Qubit Hamiltonian",Hq)
```



```
qubit_converter = QubitConverter(mapper=BravyiKitaevMapper())  
Hq = qubit_converter.convert(fermi_ham)  
print("Bravyi-Kitaev Qubit Hamiltonian",Hq)
```

✓ 0.7s

```
J-W Qubit Hamiltonian 4.0 * IIII
```

```
- 0.5 * IIIZ
```

```
- 1.5 * IIZI
```

```
- 0.5 * IZII
```

```
- 1.5 * ZIII
```

```
Parity Qubit Hamiltonian 4.0 * IIII
```

```
- 0.5 * IIIZ
```

```
- 1.5 * IIZZ
```

```
- 0.5 * IZZI
```

```
- 1.5 * ZZII
```

```
Bravyi-Kitaev Qubit Hamiltonian 4.0 * IIII
```

```
- 0.5 * IIIZ
```

```
- 1.5 * IIZZ
```

```
- 0.5 * IZII
```

```
- 1.5 * ZZII
```

# Mapping the problem from fermion to qubit space

## Notes on other mappings

- Major drawback of parity and J-W mapping:  **$k$ -locality which is also referred to as Pauli weight**
- Other more elaborate mappings exist which scale as  $\mathcal{O}(\log_2 M)$   
[Bravyi-Kitaev  $\rightarrow$  “combines ideas” of J-W and parity mappings] or even up to  $\mathcal{O}(\log_3 M)$
- Customised (tree-based) mappings tailored to QC hardware layout are also possible!

# Mapping the problem from fermion to qubit space

## Notes on other mappings

- Common outcome of mappings:  $\hat{H}_e$  is expressed as a sum of Pauli strings  $P_k$

$$\hat{H}_e = \sum_{pq} h_{pq} a_p^\dagger a_q + \frac{1}{2} \sum_{pqrs} g_{pqrs} a_p^\dagger a_r^\dagger a_s a_q \quad \longrightarrow \quad \hat{H}_e = \sum_k c_k P_k$$

# Calculating the energy

on a quantum computer

- The Hamiltonian is given as a linear combination of Pauli strings

$$\hat{H}_e = \sum_k c_k P_k \quad \leftarrow \quad \text{Each term is a product of local operators} \quad P_k = \bigotimes_{s=0}^{M-1} \sigma_{k_s, (s)}$$

- We can calculate expectation values on the quantum computer

$$|\Psi\rangle = \sum_{\mathbf{f}} c_{\mathbf{f}} |f_{M-1} \cdots f_1 f_0\rangle \quad \longrightarrow \quad \langle \Psi | \hat{H}_e | \Psi \rangle = \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

# Calculating the energy

on a quantum computer

- The Hamiltonian is given as a linear combination of Pauli strings

$$\hat{H}_e = \sum_k c_k P_k \quad \leftarrow \quad \text{Each term is a product of local operators} \quad P_k = \bigotimes_{s=0}^{M-1} \sigma_{k_s, (s)}$$

- We can calculate expectation values on the quantum computer

$$|\Psi\rangle = \sum_{\mathbf{f}} c_{\mathbf{f}} |f_{M-1} \cdots f_1 f_0\rangle \quad \longrightarrow \quad \langle \Psi | \hat{H}_e | \Psi \rangle = \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

Cannot even be written down  
on a classical computer

“Easy” on a quantum computer: only  
requires measuring Pauli strings

# Calculating the energy

on a quantum computer

- The Hamiltonian is given as a linear combination of Pauli strings

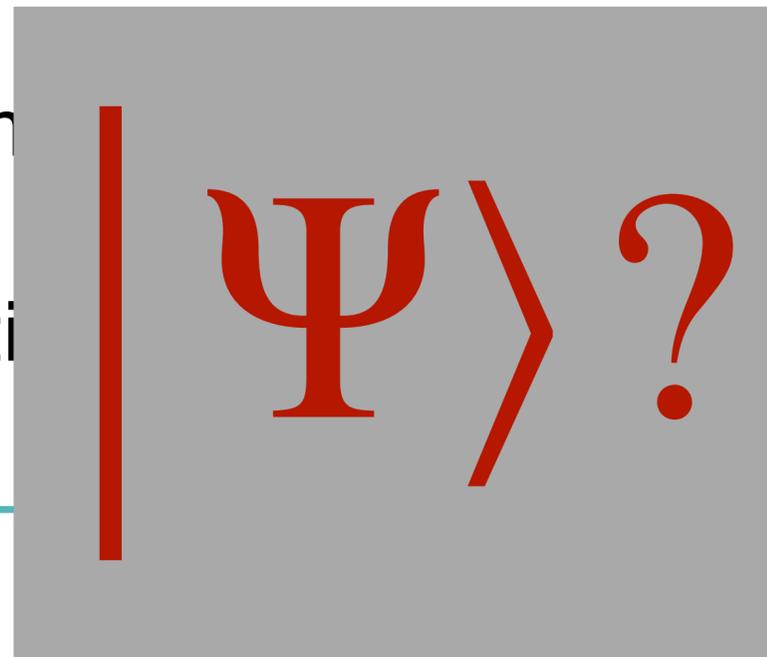
$$\hat{H}_e = \sum_k c_k P_k \quad \leftarrow \text{Each term is a Pauli operator} \quad P_k = \bigotimes_{s=0}^{M-1} \sigma_{k_s, (s)}$$

- We can calculate expectation values on a quantum computer

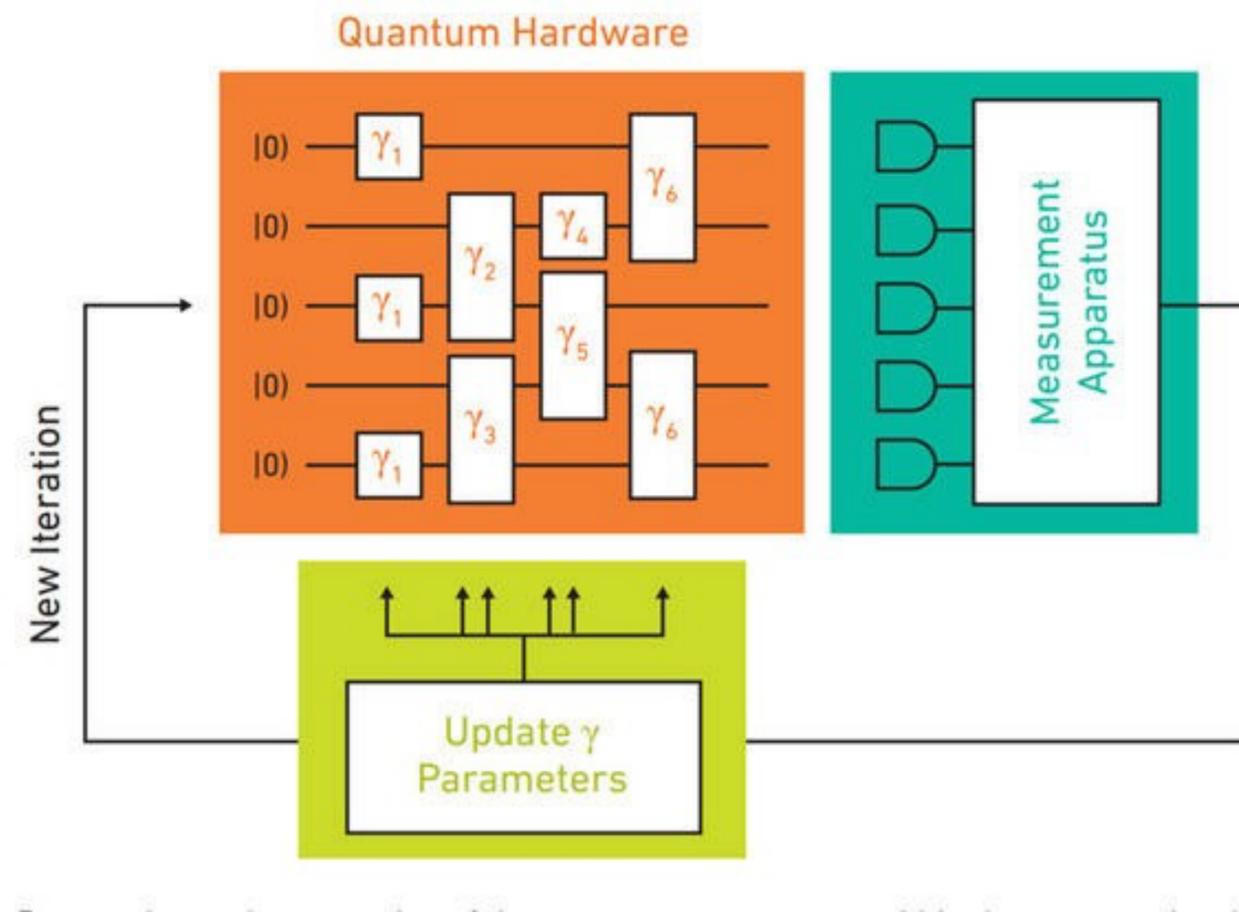
$$|\Psi\rangle = \sum_{\mathbf{f}} c_{\mathbf{f}} |f_{M-1} \dots f_1 f_0\rangle \quad \leftarrow \quad \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

Cannot even be written down  
on a classical computer

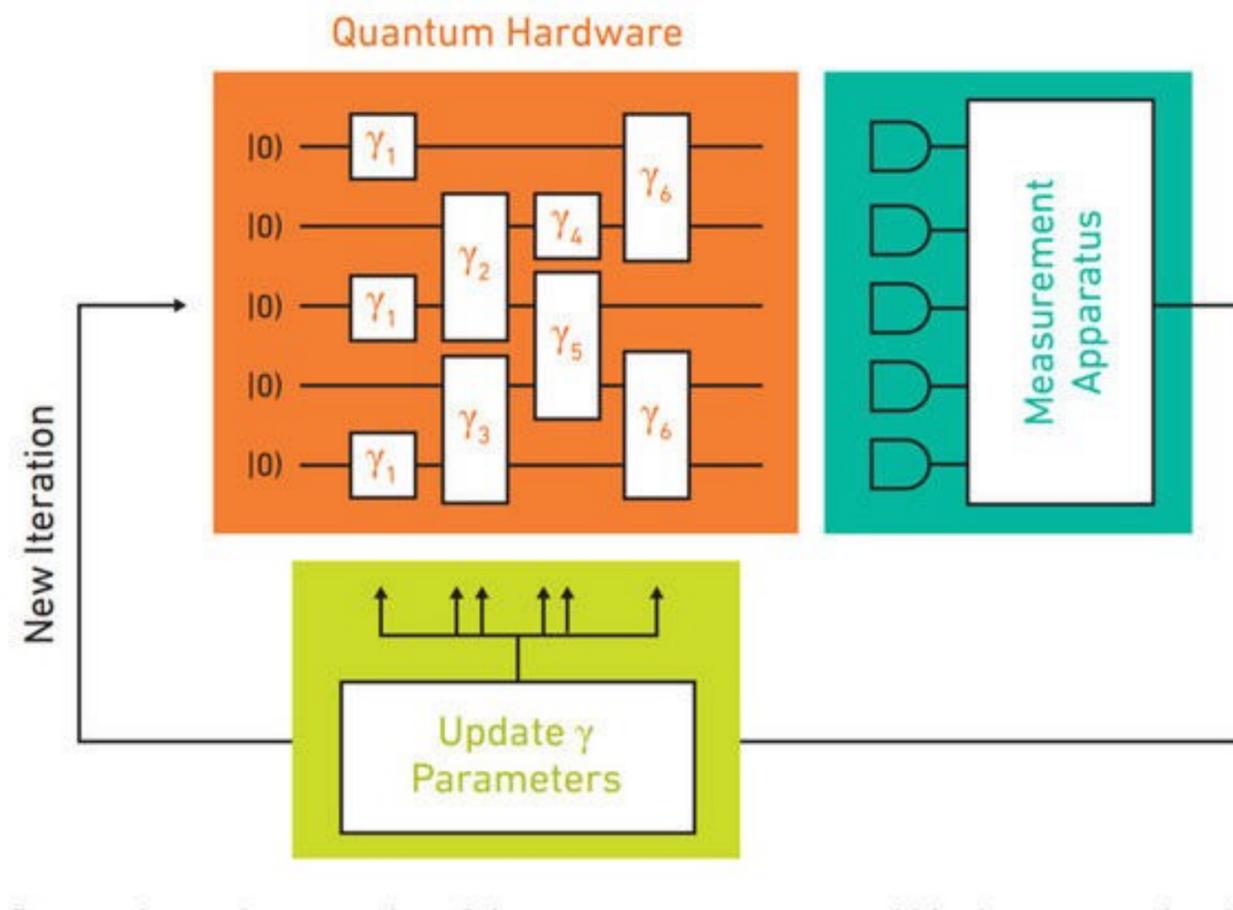
“Easy” on a quantum computer: only  
requires measuring Pauli strings



# Variational optimisation with the Variational Quantum Eigensolver



# Variational optimisation with the Variational Quantum Eigensolver

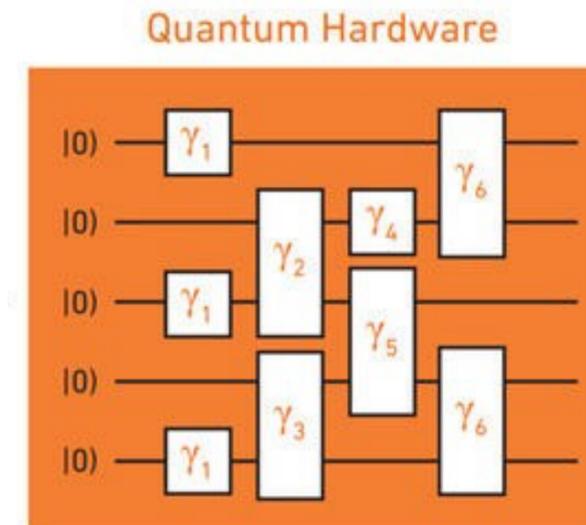


... which is just one example, many algorithms exist, not to mention fault-tolerant ones...

# Solving the problem

## The Variational Quantum Eigensolver

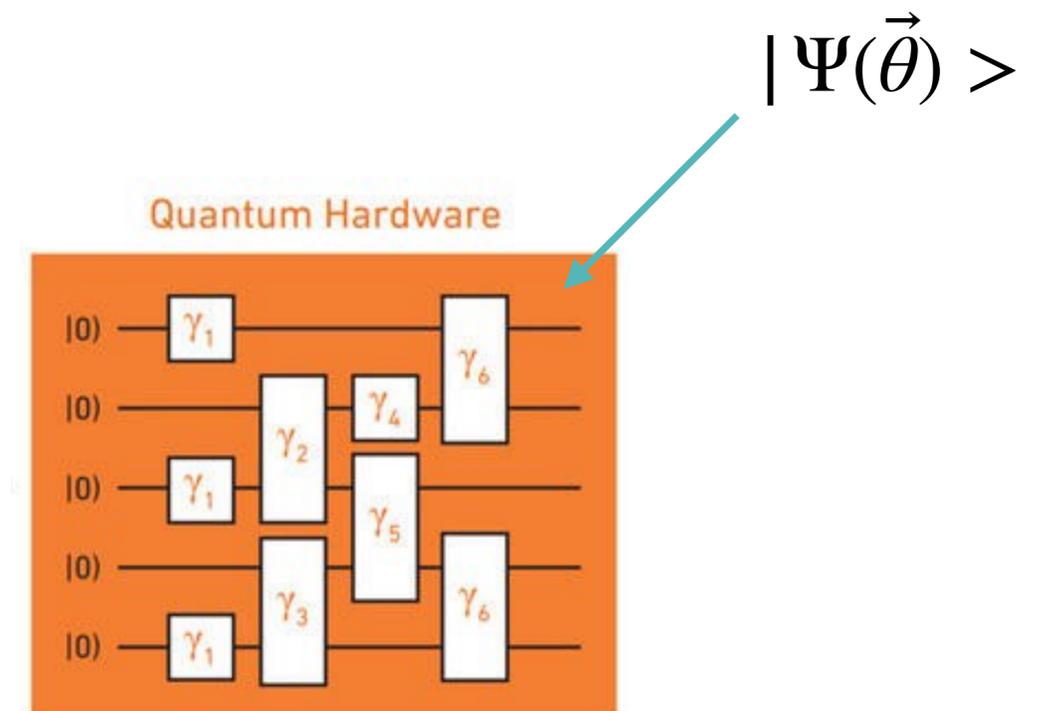
- Prepare *some* quantum state using a so-called variational form (ansatz)



# Solving the problem

## The Variational Quantum Eigensolver

- Prepare *some* quantum state using a so-called variational form (ansatz)
- Gates (unitary rotations) in the ansatz have free parameters  $\{\vec{\theta}\}$

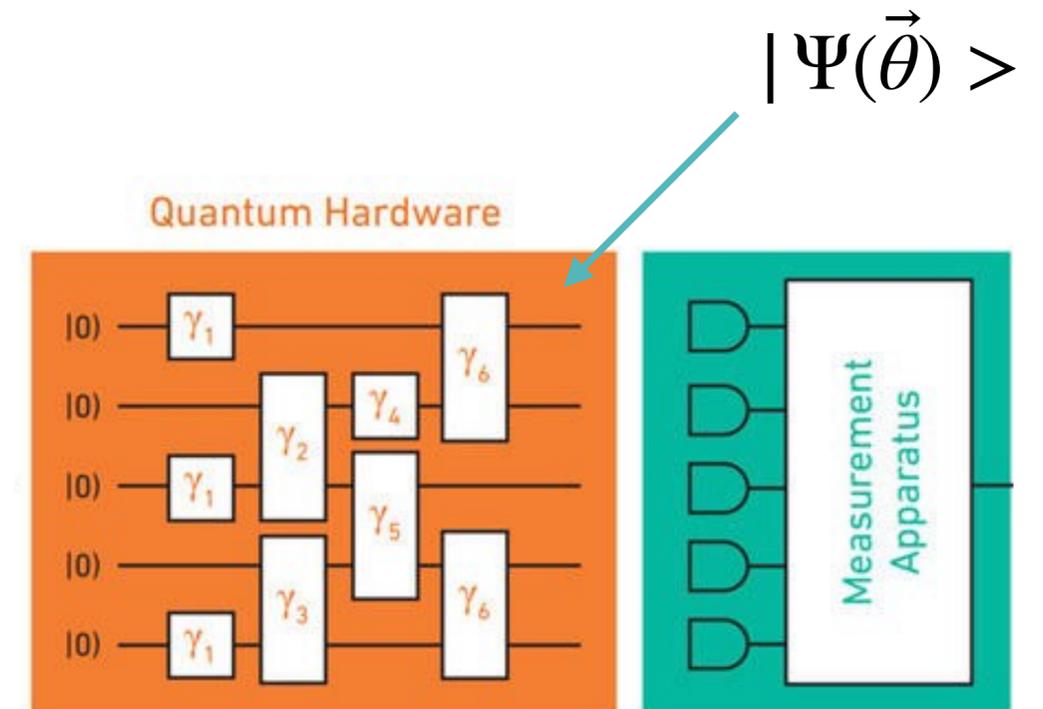


# Solving the problem

## The Variational Quantum Eigensolver

- Prepare *some* quantum state using a so-called variational form (ansatz)
- Gates (unitary rotations) in the ansatz have free parameters  $\{\vec{\theta}\}$
- For each value of the parameters the resulting state has some mean energy

$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$



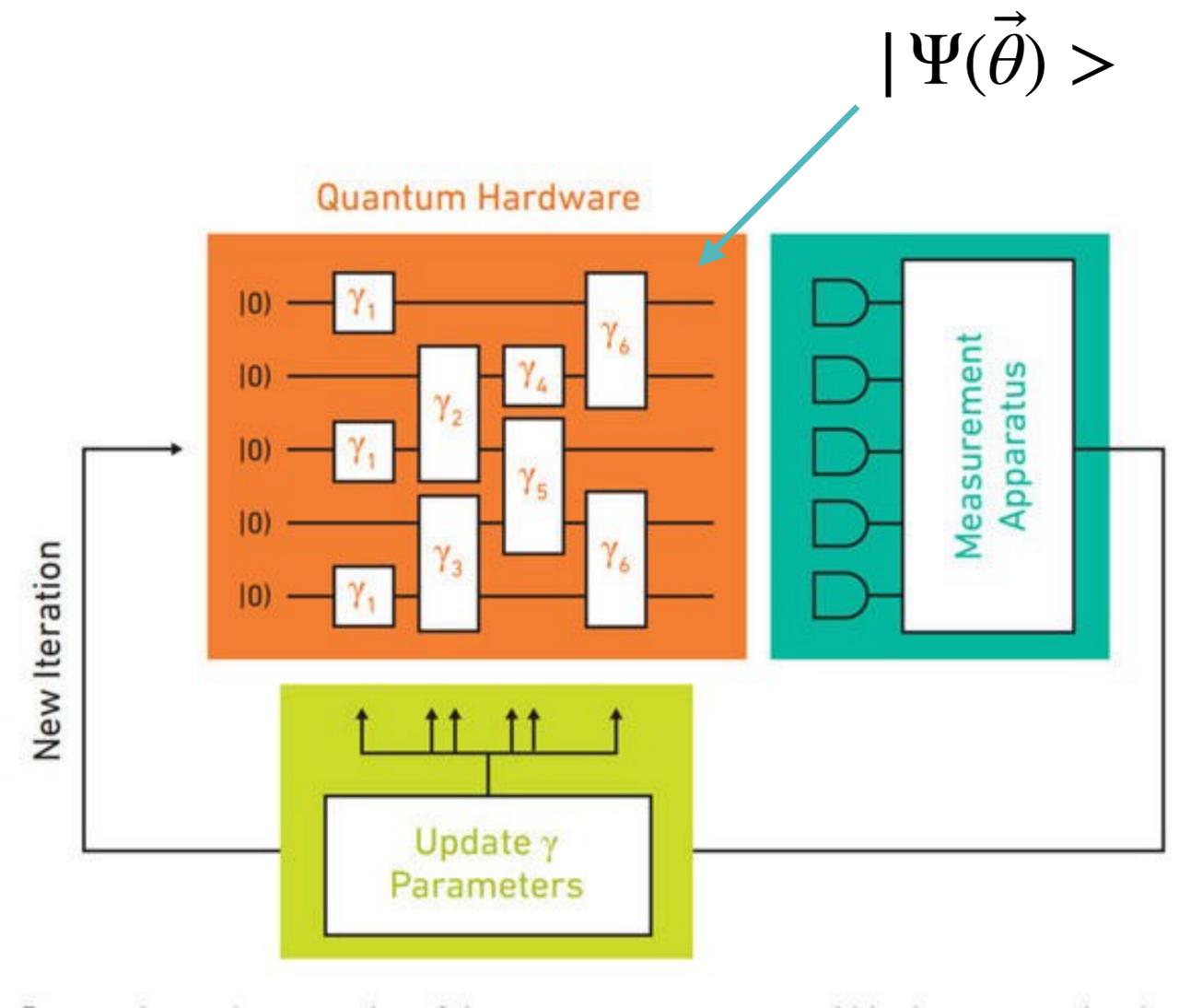
# Solving the problem

## The Variational Quantum Eigensolver

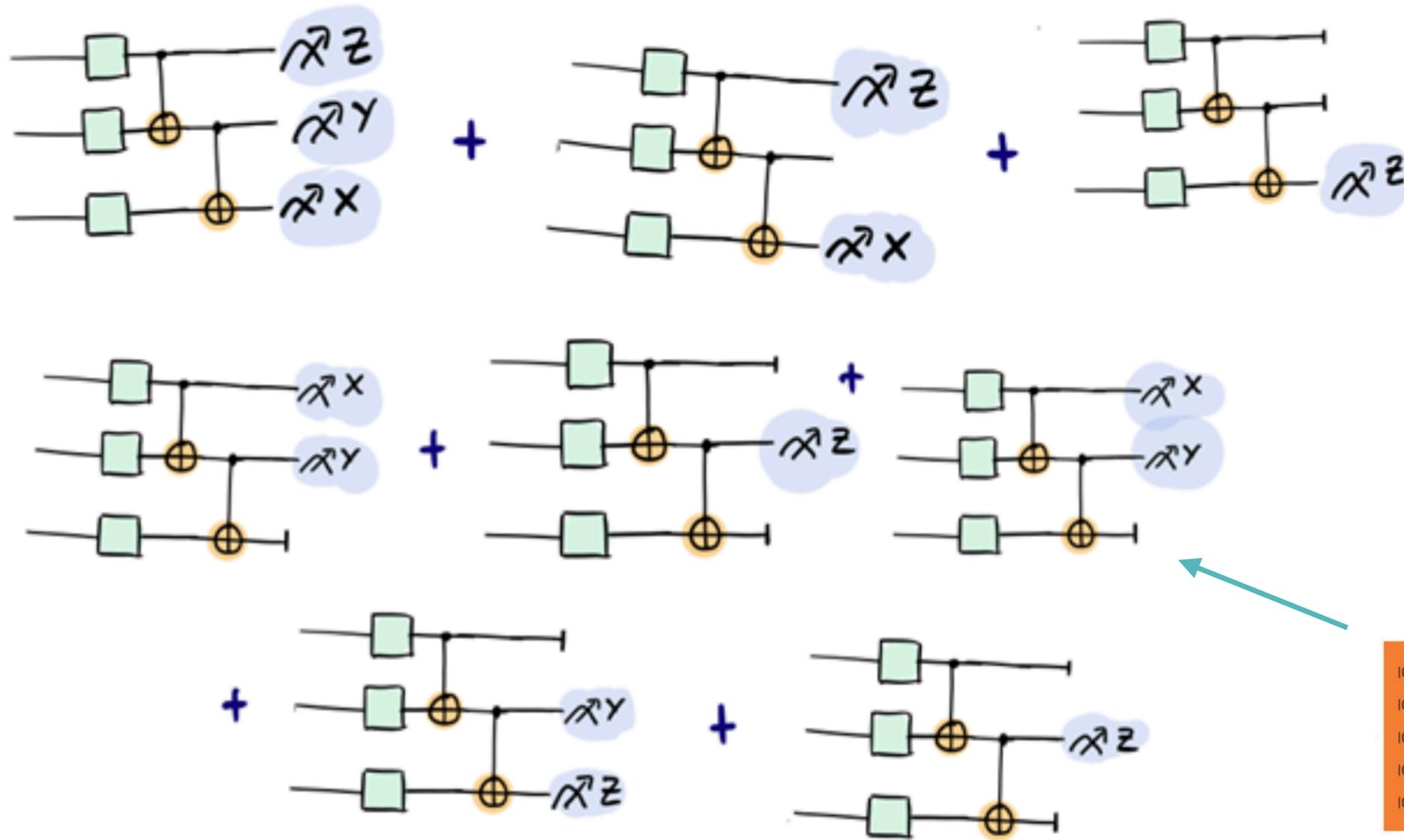
- Prepare *some* quantum state using a so-called variational form (ansatz)
- Gates (unitary rotations) in the ansatz have free parameters  $\{\vec{\theta}\}$
- For each value of the parameters the resulting state has some mean energy

$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

- Find the ground state variationally: minimising over the parameters  $\{\vec{\theta}\}$



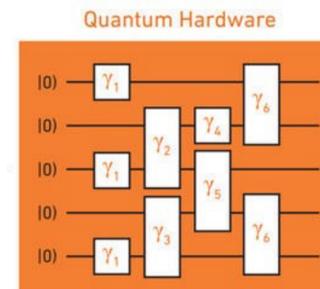
# Measuring the energy in a VQE simulation



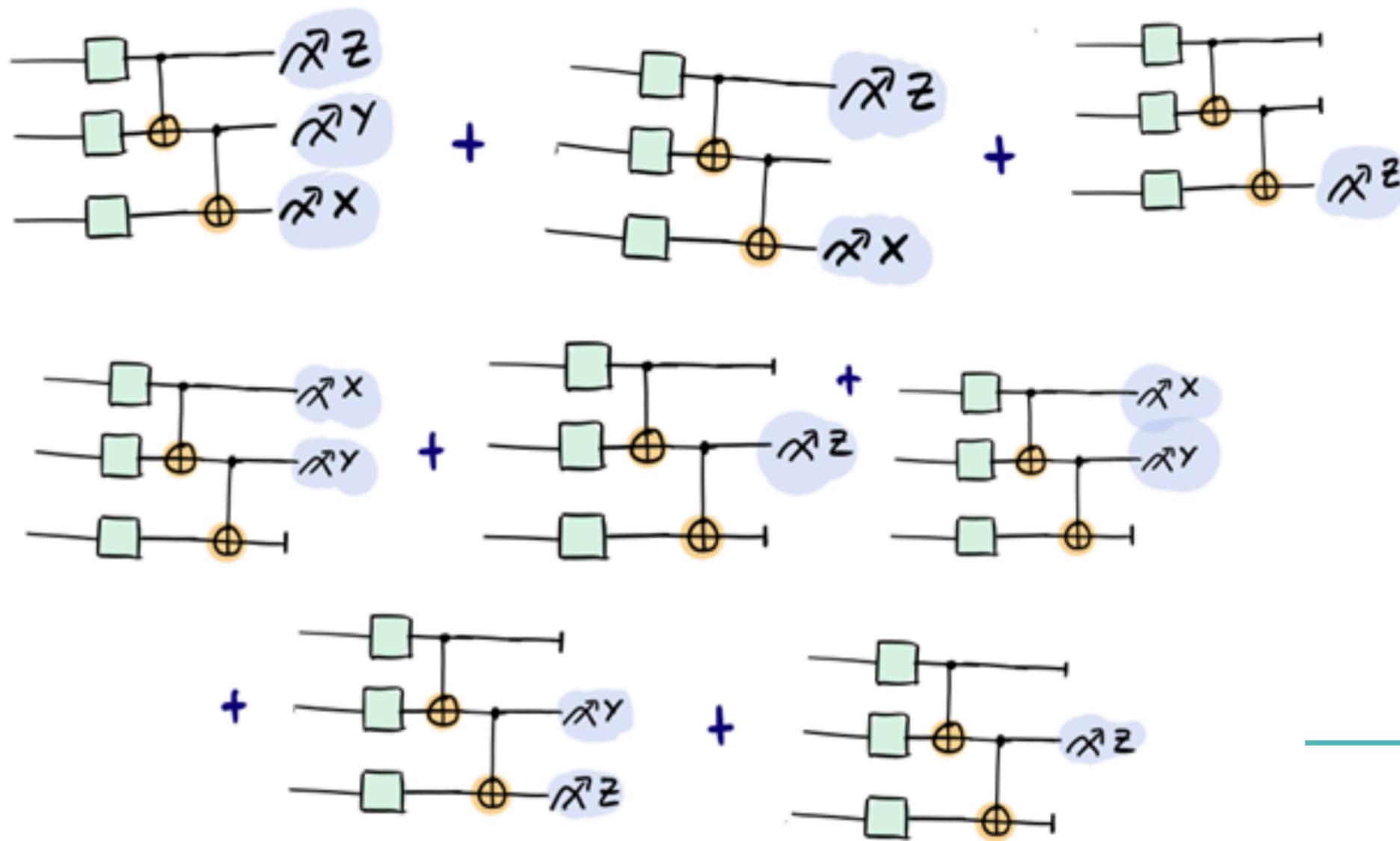
$$\langle \Psi | \hat{H}_e | \Psi \rangle = \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

↓

Every Pauli string evaluated independently through repeated measurements



# Measuring the energy in a VQE simulation



$$\langle \Psi | \hat{H}_e | \Psi \rangle = \sum_k c_k \langle \Psi | P_k | \Psi \rangle$$

Every Pauli string evaluated independently through repeated measurements

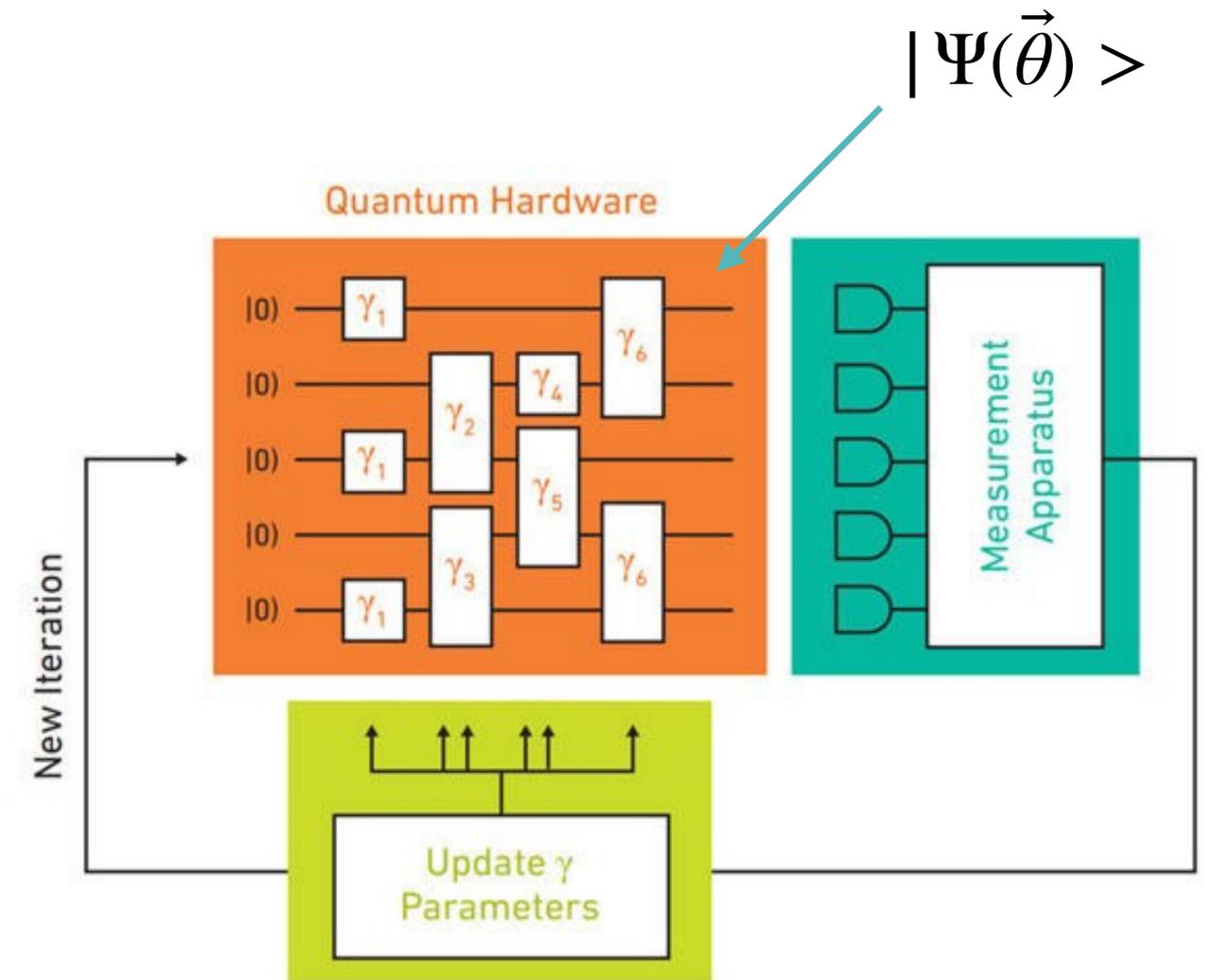
Repeat each many times to estimate the mean  $\langle \Psi | P_k | \Psi \rangle$

# Solving the problem?

## The Variational Quantum Eigensolver

Sounds good, BUT

- How do we know the ansatz contains the ground state?
- How do we find the corresponding parameters?
- How efficient is the whole approach?
- What about the noise?

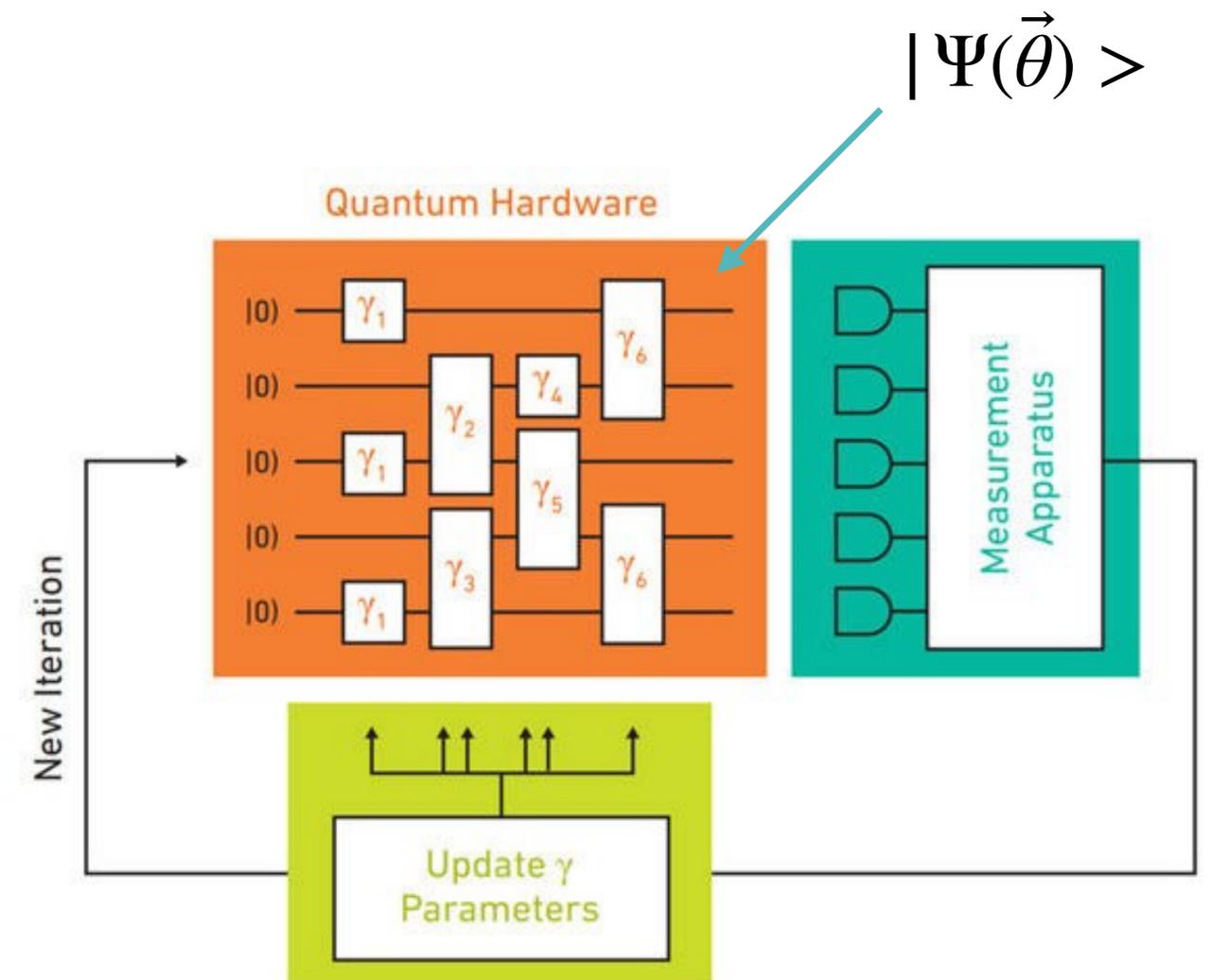


$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

# Solving the problem

## The Variational Quantum Eigensolver

- There are mainly two broad strategies in circuit ansatz design
  - physically motivated ansätze
  - hardware heuristic ansätze
    - > parametrized circuits comprising single-qubit rotations and entangling blocks chosen to take advantage of specific quantum hardware capabilities

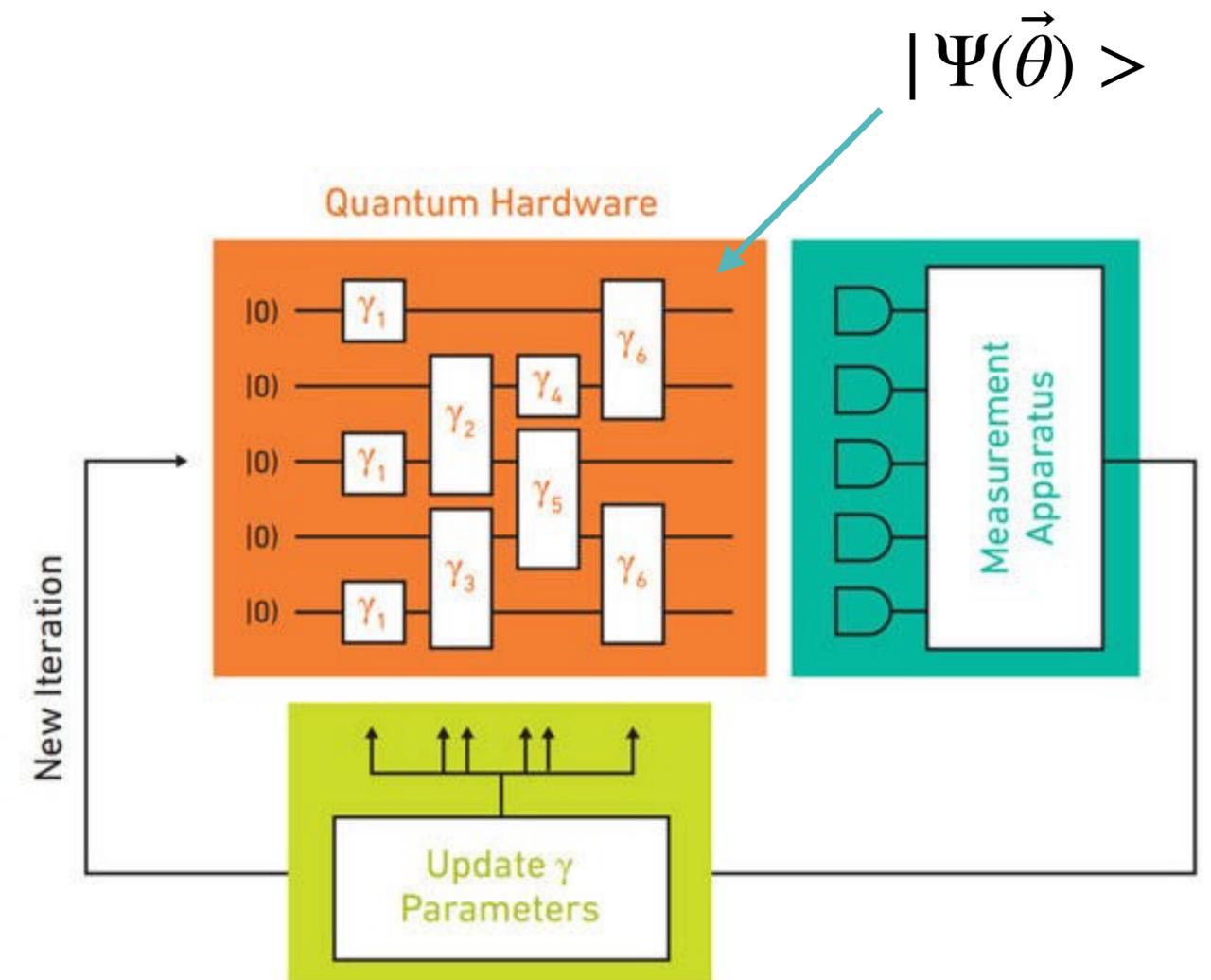


$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

# Solving the problem

## The Variational Quantum Eigensolver

- There are mainly two broad strategies in circuit ansatz design
  - physically motivated ansätze
  - hardware heuristic ansätze
    - > parametrized circuits comprising single-qubit rotations and entangling blocks chosen to take advantage of specific quantum hardware capabilities



$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

# The Variational Quantum Eigensolver

## UCCSD ansatz

- UCCSD ansatz has the form

$$\begin{aligned} \hat{T}_1 &= \sum_{i,a} \hat{\tau}_i^a = \sum_{i,a} \tau_i^a (a_a^\dagger a_i - a_i^\dagger a_a) \\ |\Psi_{\text{UCCSD}}\rangle &= e^{\hat{T}_1 + \hat{T}_2} |\Psi_{\text{ref}}\rangle \quad \text{with} \\ \hat{T}_2 &= \sum_{i,j,a,b} \hat{\tau}_{ij}^{ab} = \sum_{i,j,a,b} \tau_{ij}^{ab} (a_a^\dagger a_b^\dagger a_i a_j - a_j^\dagger a_i^\dagger a_b a_a) \end{aligned}$$

- Commonly approximation: Trotterize unitary to first order

$$|\Psi_{\text{tUCCSD}}\rangle = \prod_{c \in \{ia\}} e^{\hat{\tau}_c} \prod_{d \in \{ijab\}} e^{\hat{\tau}_d} |\Psi_{\text{ref}}\rangle$$

—> Low-order trotterized form may fail to reach chemical accuracy

—> Large number of exponential factors prohibits preparation on quantum processors

# The Variational Quantum Eigensolver

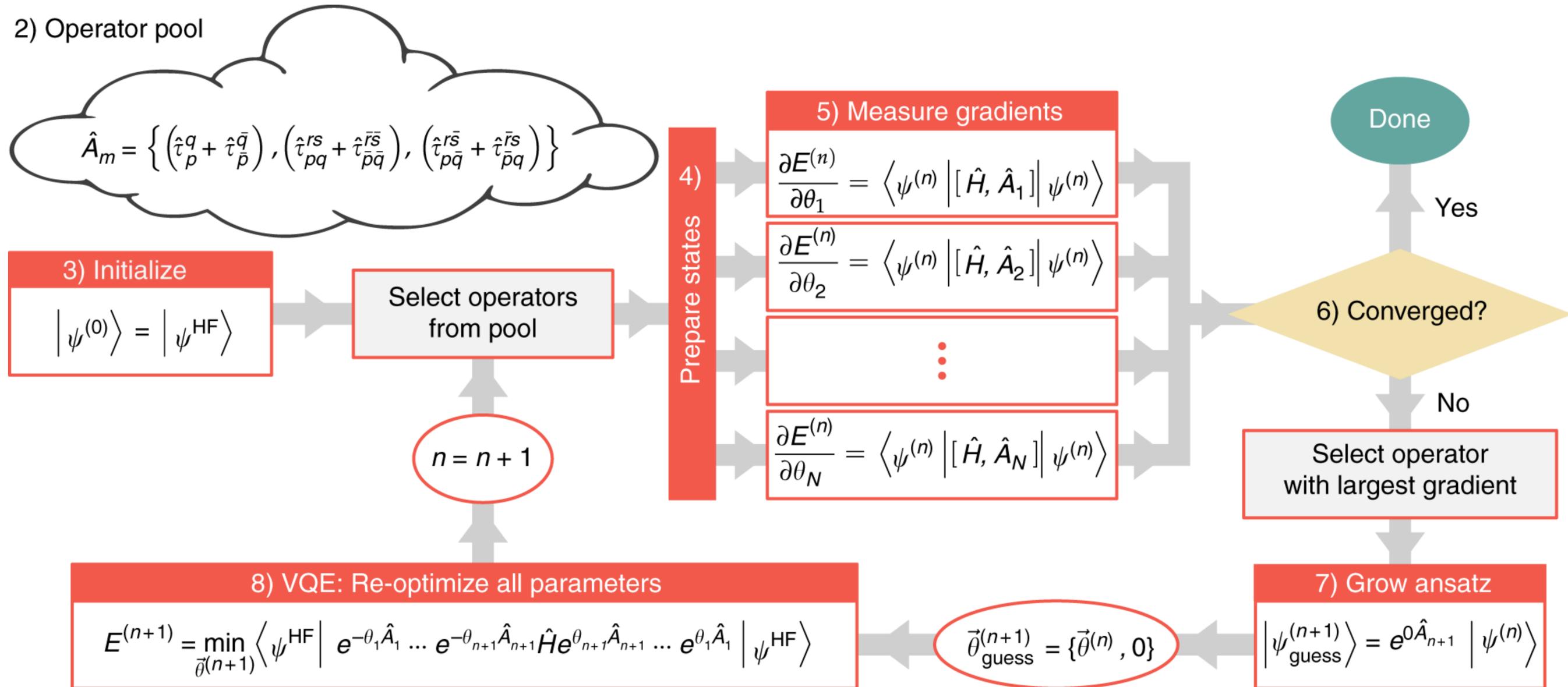
## ADAPT-VQE ansatz

- The ADAPT-VQE algorithm grows ansätze by appending one unitary at a time to a trial state
- Requires to
  - a priori define an operator pool  $\mathcal{P} = \{P_i\}$ , a collection of antihermitian generators
    - $\hat{\tau}_i^a$  and  $\hat{\tau}_{ij}^{ab}$  in UCCSD
  - choose a reference state calculate (HF or anything reasonable)

$$\left. \frac{\partial E}{\partial \theta_i} \right|_{\theta_i=0} = \left[ \left. \frac{\partial}{\partial \theta_i} \langle \Psi^{(k)} | e^{-\theta_i P_i} H e^{\theta_i P_i} | \Psi^{(k)} \rangle \right] \right|_{\theta_i=0} = \langle \Psi^{(k)} | [H, P_i] | \Psi^{(k)} \rangle$$

- The operator with the largest gradient norm is appended to the ansatz

# Choosing an ansatz - ADAPT-VQE

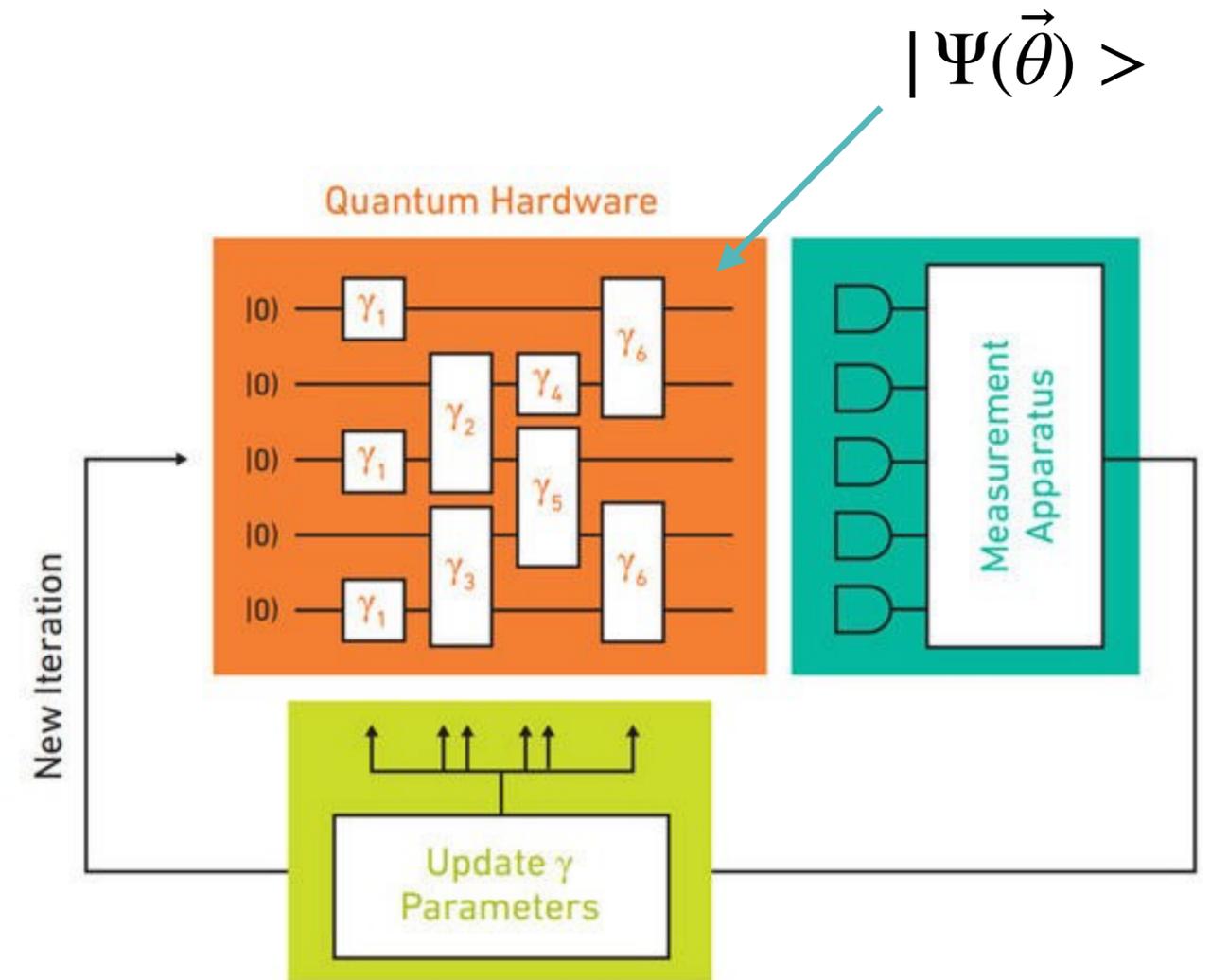


# Solving the problem?

## The Variational Quantum Eigensolver

Sounds good, BUT

- How do we know the ansatz contains the ground state?
- How do we find the corresponding parameters?
- How efficient is the whole approach?
- What about the noise?



$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

# Solving the problem?

## The Variational Quantum Eigensolver

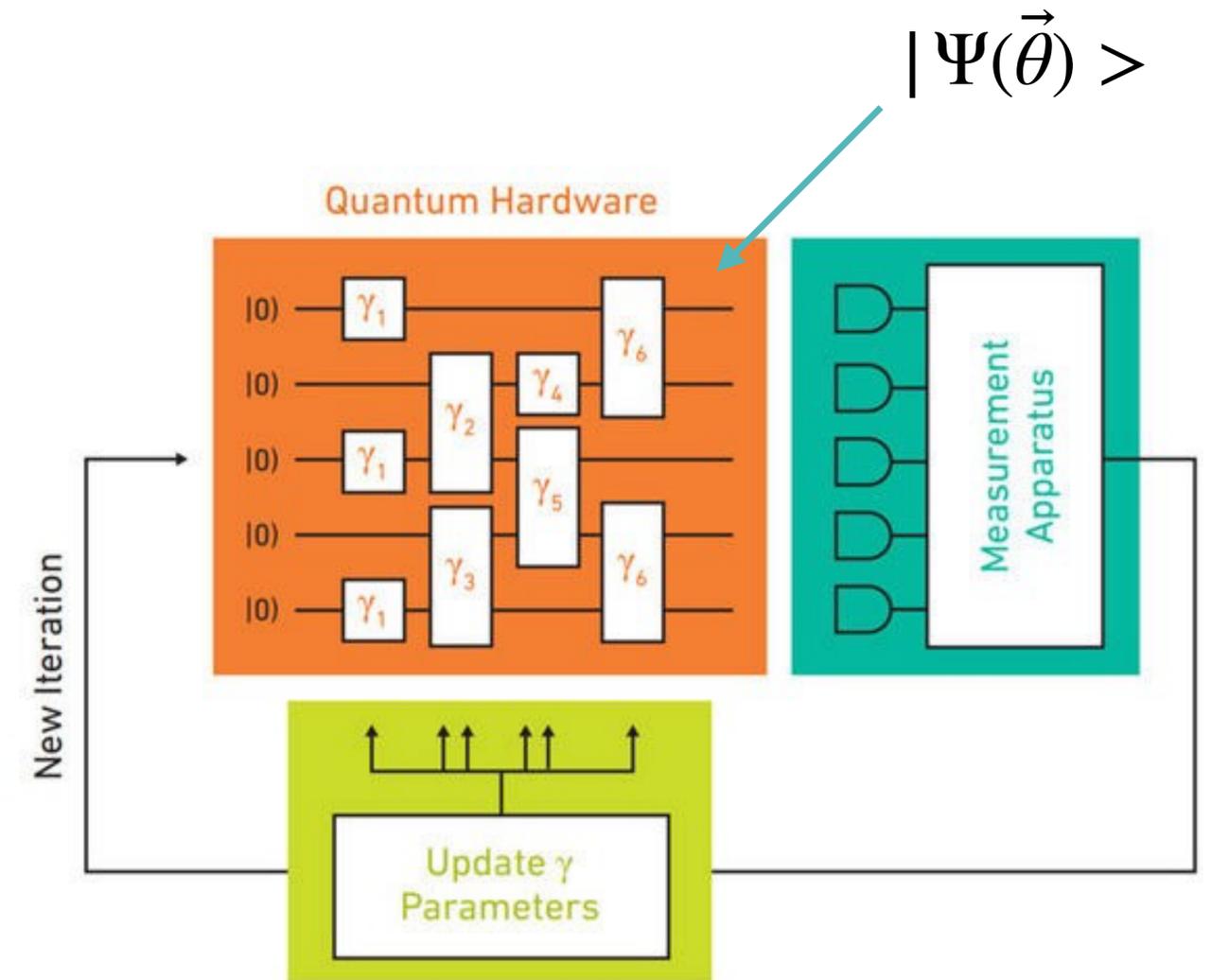
Identifying challenges towards practical quantum advantage through resource estimation:  
the **measurement roadblock** in the variational quantum eigensolver

Jérôme F. Gonthier,<sup>1</sup> Maxwell D. Radin,<sup>1</sup> Corneliu Buda,<sup>2</sup>  
Eric J. Daskocil,<sup>2</sup> Clena M. Abuan,<sup>3</sup> and Jhonathan Romero<sup>1</sup>  
<sup>1</sup>Zapata Computing, Inc., 100 Federal St., Boston, MA 02110, USA

Molecule	H <sub>2</sub> O	CO <sub>2</sub>	CH <sub>4</sub>	CH <sub>4</sub> O	C <sub>2</sub> H <sub>6</sub>	C <sub>2</sub> H <sub>4</sub>	C <sub>2</sub> H <sub>2</sub>	C <sub>2</sub> H <sub>6</sub> O	C <sub>3</sub> H <sub>8</sub>	C <sub>3</sub> H <sub>6</sub>	C <sub>3</sub> H <sub>4</sub>
N <sub>el</sub>	8	16	8	14	14	12	10	20	20	18	16
N <sub>q</sub>	104	208	104	182	182	156	130	260	260	234	208
K · 10 <sup>-3</sup>	1.9	16	1.6	8.4	8.5	6.6	3.1	24	16	23	18
M · 10 <sup>-9</sup>	3.9	32	3.2	17	17	13	6.2	48	31	46	36
t (days)	2.3	39	1.9	18	18	12	4.6	71	47	62	44

TABLE IV. Estimated runtimes  $t$  in days for a single energy evaluation using the number of measurements  $M$  from extrapolated

arXiv: 2012.04001

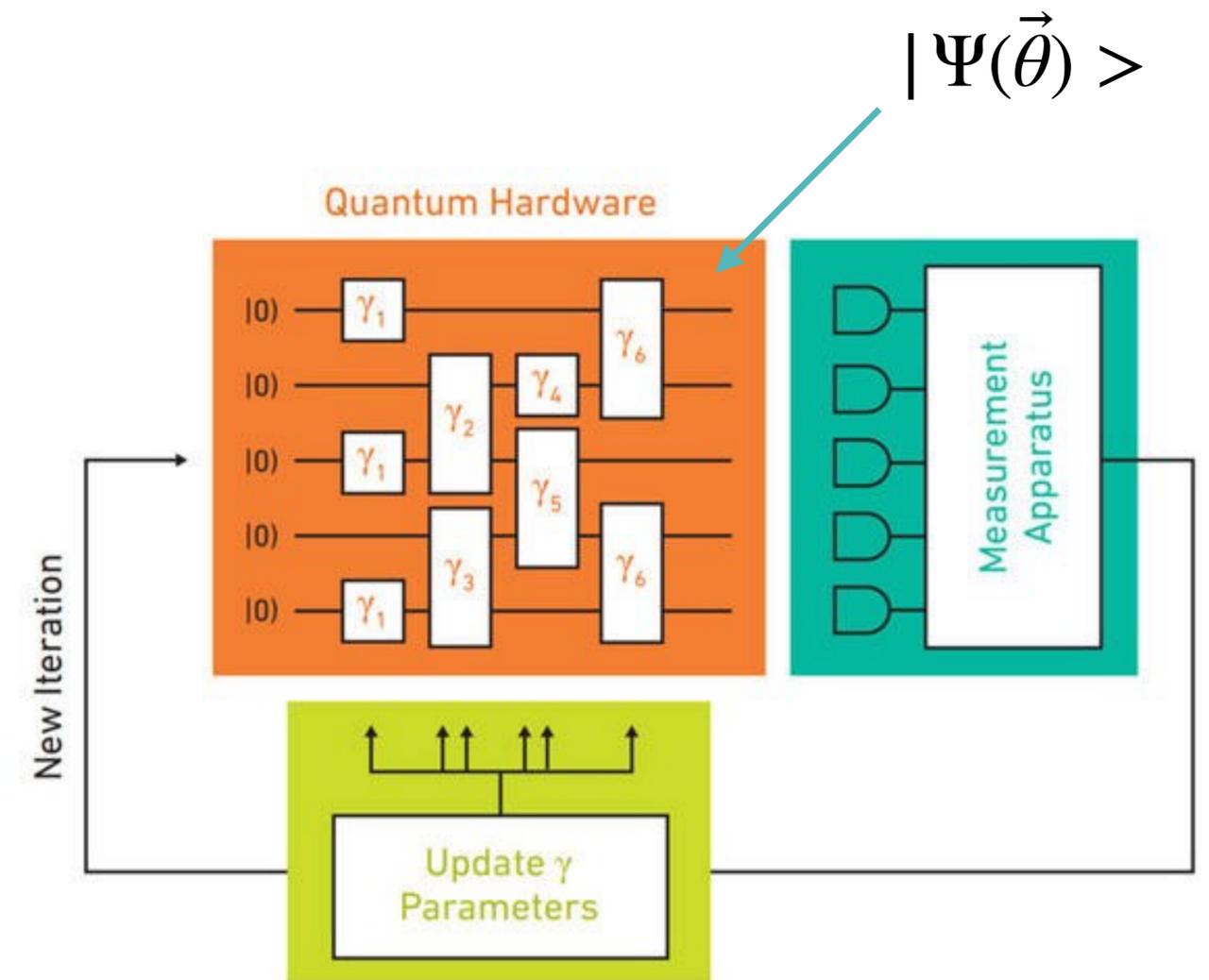


$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

# Solving the problem?

## The Variational Quantum Eigensolver

- How do we know the ansatz contains the ground state?
- How do we find the corresponding parameters?
- How efficient is the whole approach?
- What about the noise?



$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

**Efficient measurement strategies are required!**

**Noise mitigation is crucial!**

# Molecular properties / Dynamical correlation

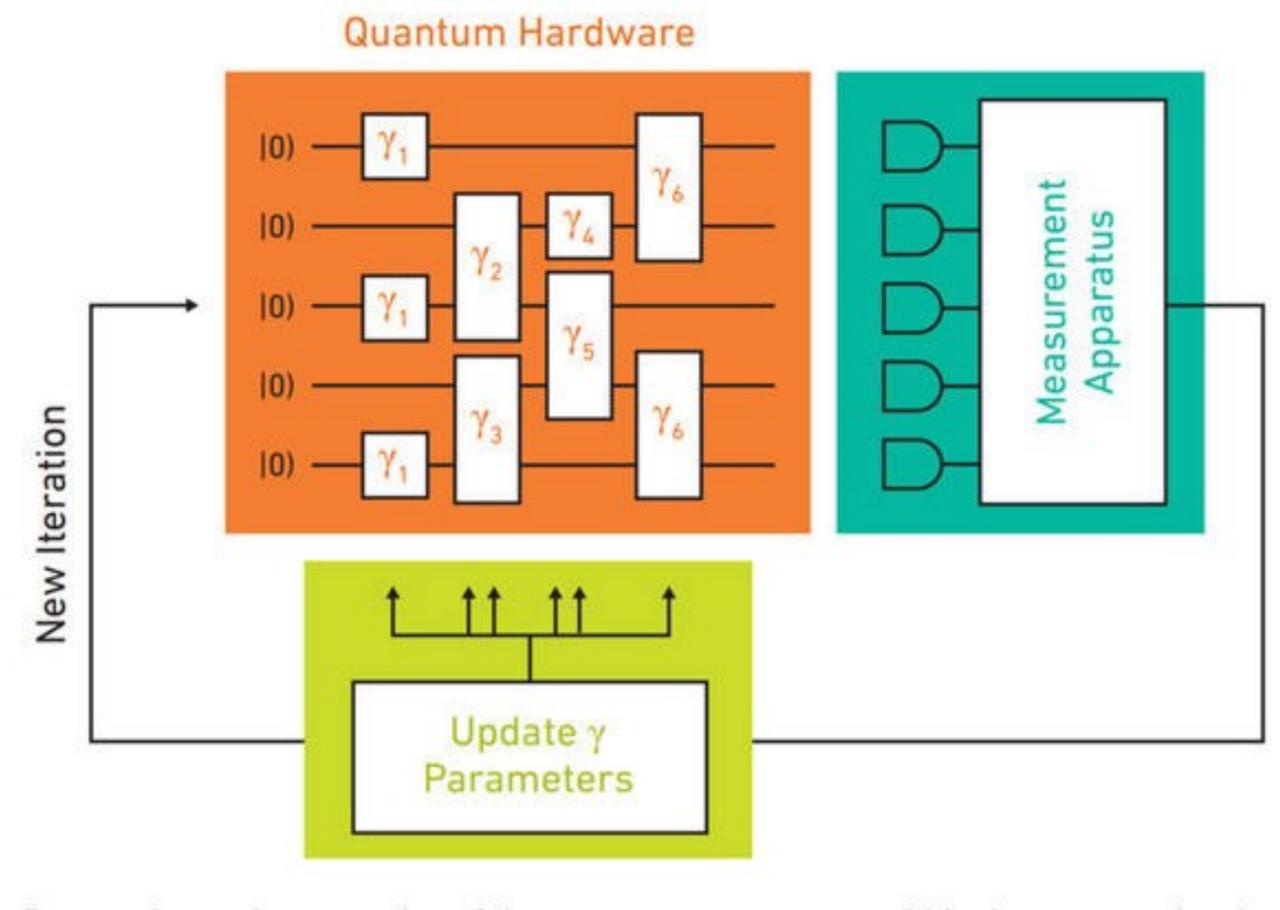
## The Variational Quantum Eigensolver

- Expectation values of one-electron  $\hat{O}_1$  and two-electron  $\hat{O}_2$  operators can be straightforwardly obtained from optimal VQE

$$\langle \hat{O}_1 \rangle = \sum_{pq} o_{pq} \langle \hat{a}_p^\dagger \hat{a}_q \rangle$$

$$\langle \hat{O}_2 \rangle = \sum_{pqrs} o_{pqrs} \langle \hat{a}_p^\dagger \hat{a}_r^\dagger \hat{a}_s \hat{a}_q \rangle$$

- Higher-order RDMs ...  
—> CASPT2/NEVPT2, response theory, ...
- *quantum* equation-of-motion ...
- ...



$$\langle E \rangle = \langle \Psi(\vec{\theta}) | \hat{H}_e | \Psi(\vec{\theta}) \rangle \geq E_{\text{ground}}$$

## CONCLUSION

# Quantum computers without algorithms are useless machines

With proper algorithms we can make quantum computers work

We need to know how to measure

We need to mitigate errors and correct for them

