

# Materials science and chemistry with quantum algorithms:

# from the textbook to the processor

TERATEC TQCI - Quantum algorithms in the NISQ era

Thursday, November 14<sup>th</sup> 2024

Thomas Ayral Eviden Quantum Lab, France

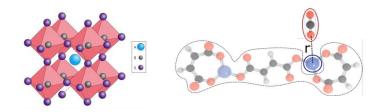
an atos business

### The textbook:

On the one hand:

A complex quantum system

$$i\hbar \frac{d|\Psi\rangle}{dt} = H(t)|\Psi\rangle$$





### The textbook:

On the one hand:

On the other hand:

### A complex quantum system

### A complex... artificial... quantum system



### The textbook:

On the one hand:

On the other hand:

A complex quantum system

### A complex... artificial... quantum system



If  $\widetilde{H} \approx H$ , we learn something about  $|\Psi\rangle$  by measuring  $|\widetilde{\Psi}\rangle$ !

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Exponential advantage for quantum dynamics (Lloyd '96)

Ground state search:

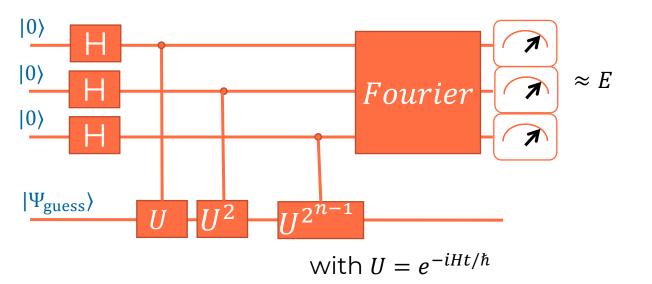
 $H|\Psi\rangle = E|\Psi\rangle$ 



Ground state search:

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Quantum phase estimation (QPE) algorithm (Kitaev 95)

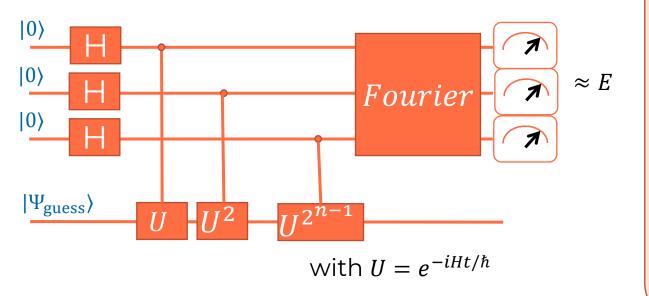




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### Large Scale Quantum: Tomorrow



# Quantum error corrected computers

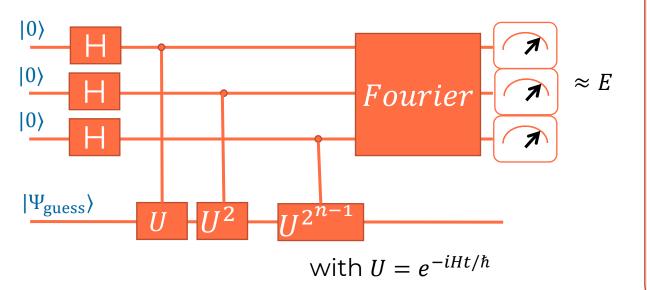
A lot (millions) of high-quality qubits

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### Large Scale Quantum: Tomorrow



**Quantum error corrected computers** A lot (millions) of high-quality qubits

Most advanced experiments (Rydberg, ions, superconducting qubits):

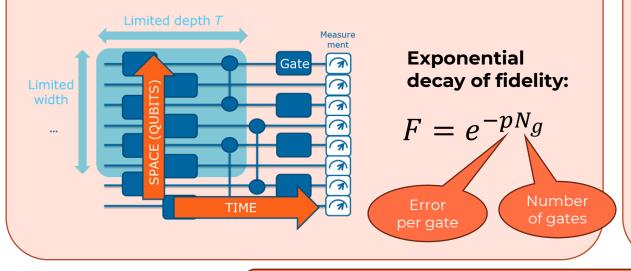
Only 10-100 physical qubits, just below threshold

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### Noisy Intermediate Scale Quantum: Today



- Small number of qubits (10-1000 today)
- High error rates (100-1000 gates)



### Large Scale Quantum: Tomorrow



### **Quantum error corrected computers** A lot (millions) of high-quality qubits

Most advanced experiments (Rydberg, ions, superconducting qubits):

Only 10-100 physical qubits, just below threshold

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### Too long... also without noise?

Ground state search:

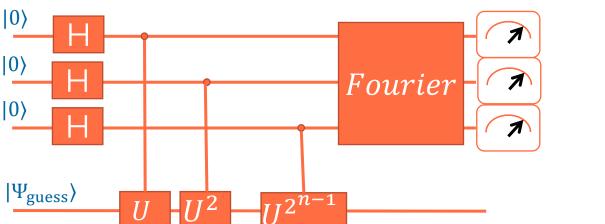
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Quantum phase estimation (QPE) algorithm (Kitaev 95)



Key point: role of overlap  $\Omega = \left| \left< \Psi_{\rm guess} \middle| \Psi_0 \right> \right|^2$ 

Need  $O(\frac{1}{\Omega})$  repetitions of QPE!





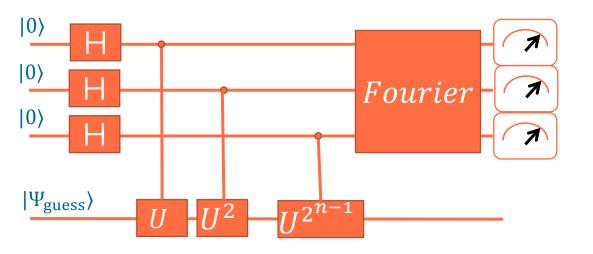
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Louvet, TA, Waintal, 2306.02620

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Need  $O(\frac{1}{\Omega})$  repetitions of QPE!

We found a formula to assess  $\Omega$  given the energy + variance of  $\Psi_{guess}$  (+ estimate of  $E_0$ ).

Applied it to advanced classical methods.

#### **Outcome:**

 $\Omega$  decreases exponentially with molecule size!



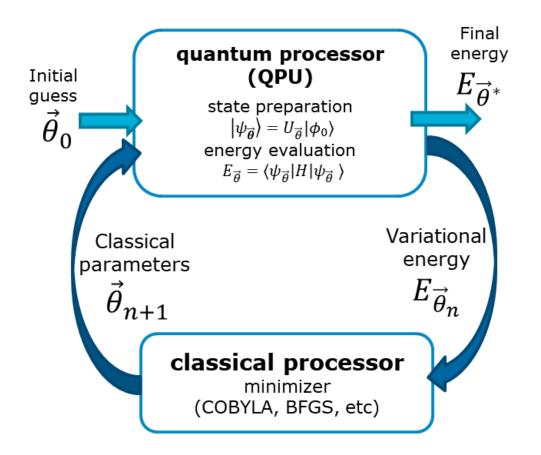




# What can one do with today's processors?

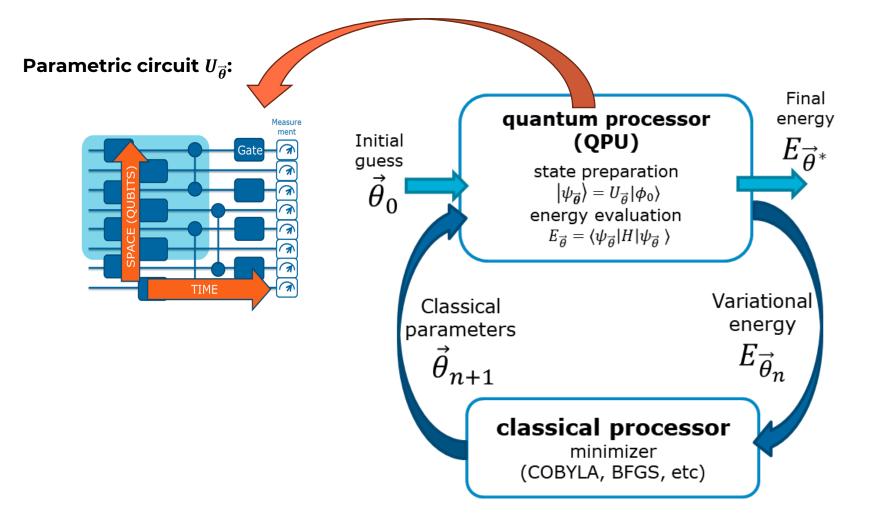
### The bread-and-butter NISQ algorithm: the variational quantum eigensolver

(Peruzzo et al 2014)





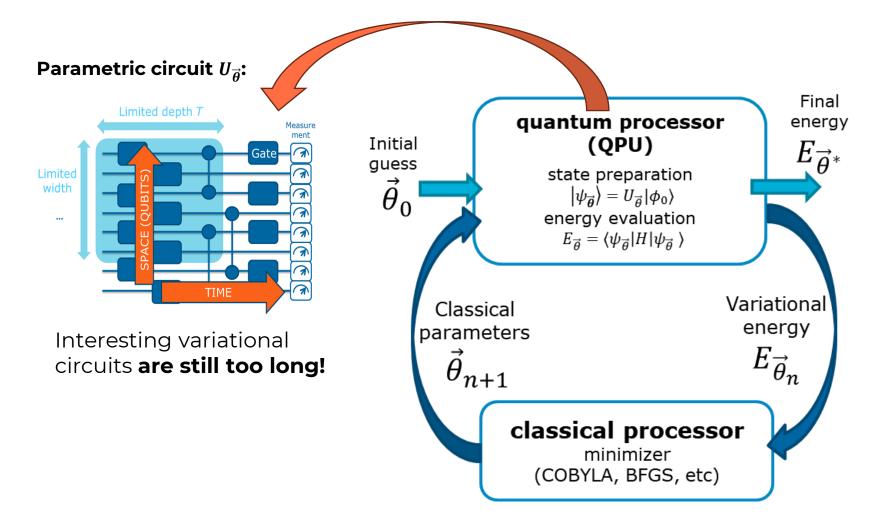
# The bread-and-butter NISQ algorithm: the variational quantum eigensolver



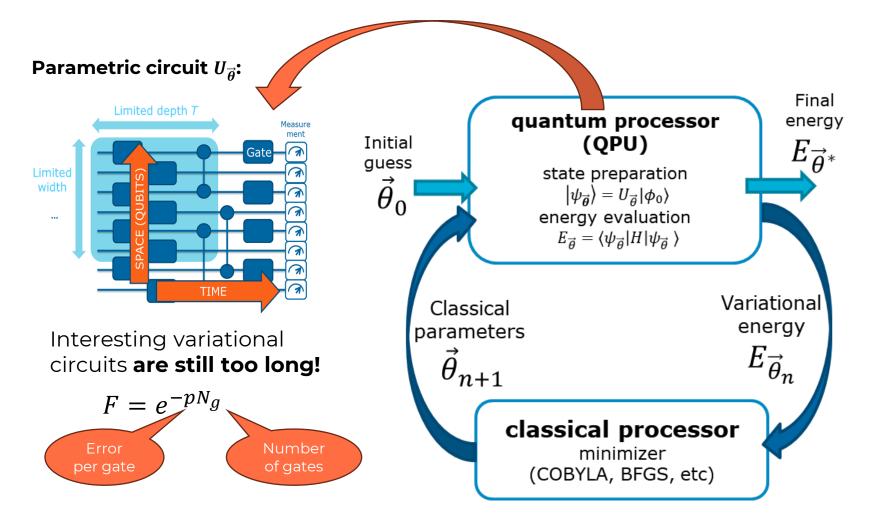
Idea: try to minimize use of quantum resources



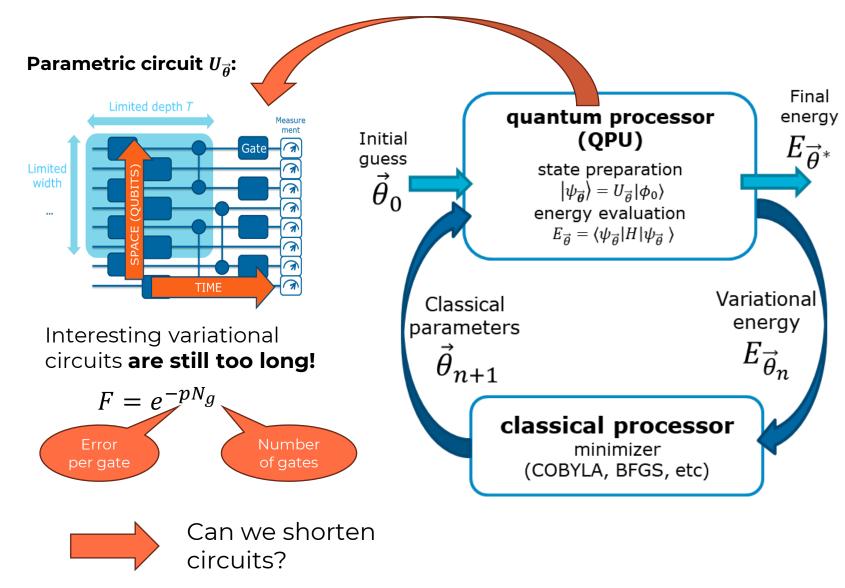
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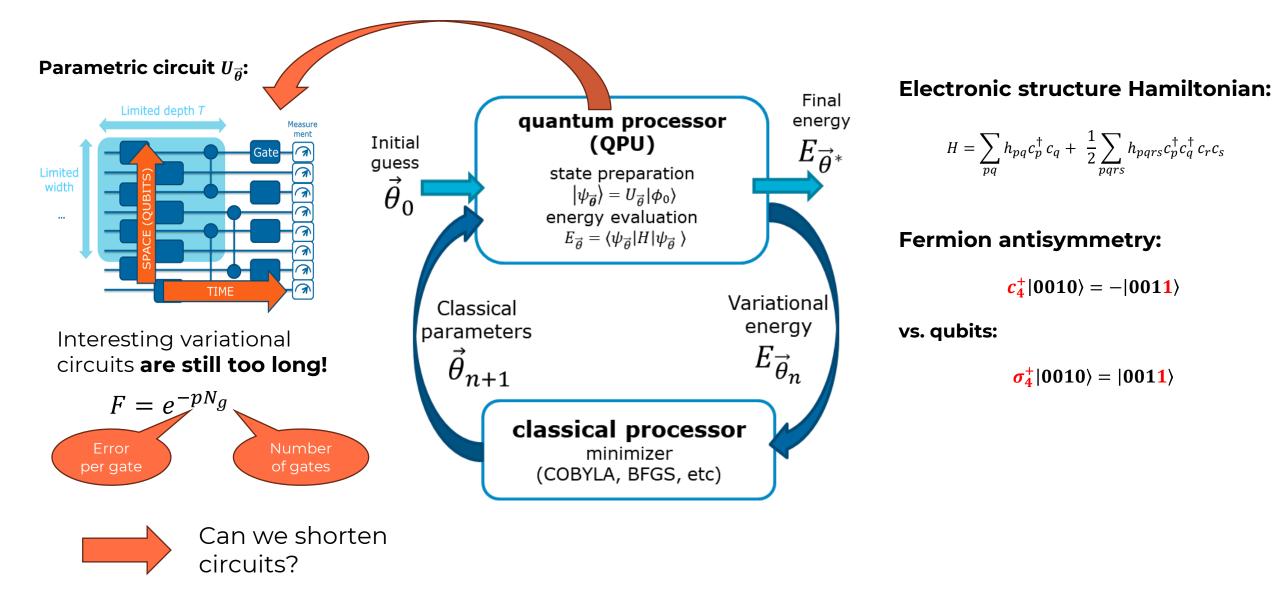




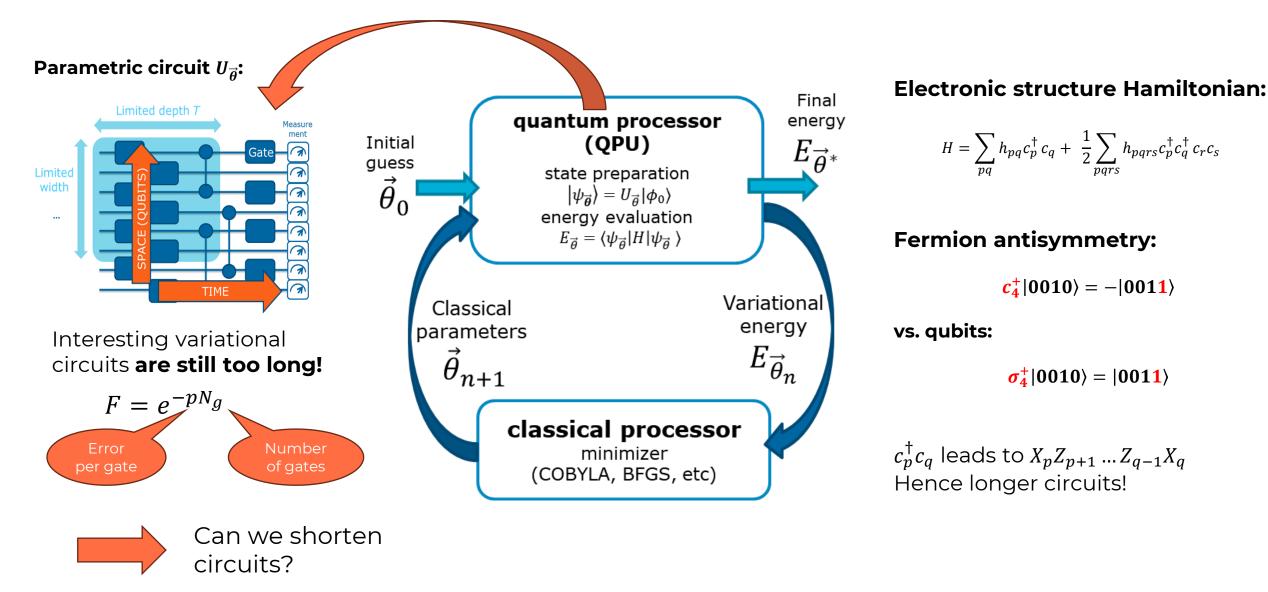




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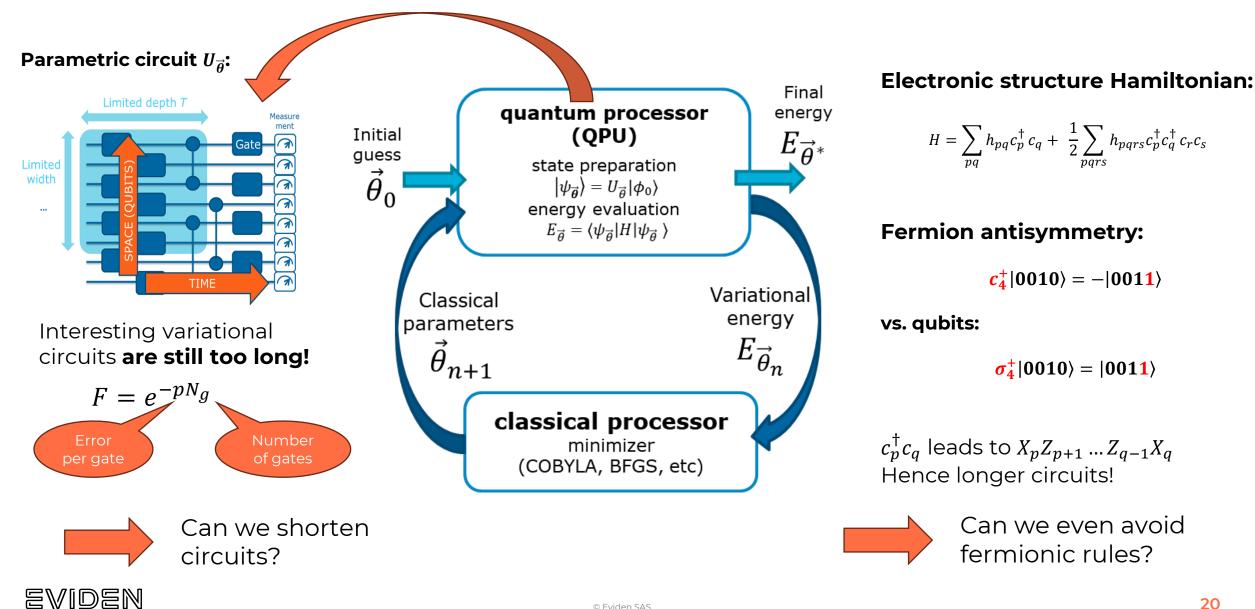


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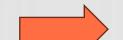


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# Outline



Can we shorten circuits?



Can we even avoid fermionic rules?



Hybridizing tensor networks and quantum algorithms



Could we use quantum noise to our advantage?

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# Outline



### Can we shorten circuits?

Can we even avoid fermionic rules?



Hybridizing tensor networks and quantum algorithms



Could we use quantum noise to our advantage?

### The importance of the orbital basis

Consider

$$H = \sum_{pq} h_{pq} c_p^{\dagger} c_q + \frac{1}{2} \sum_{pqrs} h_{pqrs} c_p^{\dagger} c_q^{\dagger} c_r c_s$$

Hartree-Fock method: define

$$\tilde{c}_i^{\dagger} = \sum_p V_{ip} c_p^{\dagger}$$

Find orbital transformation V s.t HF wavefunction  $|\Psi(V)\rangle = \tilde{c}_{i_1}^{\dagger} \cdots \tilde{c}_{i_{N_e}}^{\dagger} |00 \dots 0\rangle$ 

minimizes  $\langle \Psi(V) | H | \Psi(V) \rangle$ 

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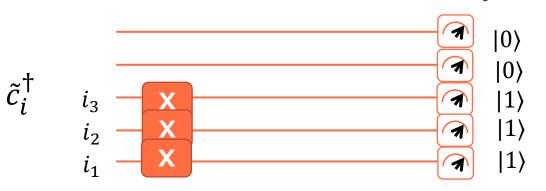
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### **Quantum computer representation?**

In  $\tilde{c}_i^{\dagger}$  (molecular orbital) basis:  $|\Psi(V)\rangle = \tilde{c}_{i_1}^{\dagger} \cdots \tilde{c}_{i_{N_a}}^{\dagger} |00 \dots 0\rangle$ 



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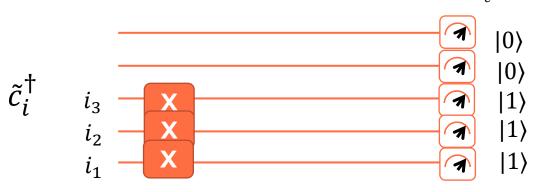
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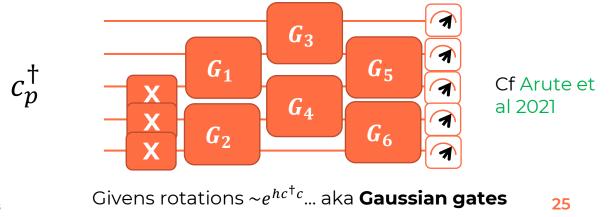
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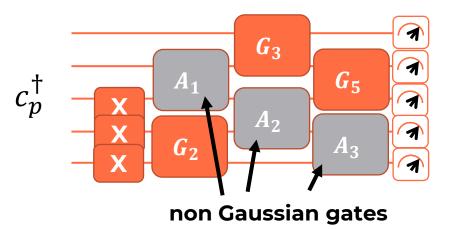


In e.g original basis...  $|\Psi(V)\rangle$  much more complicated!

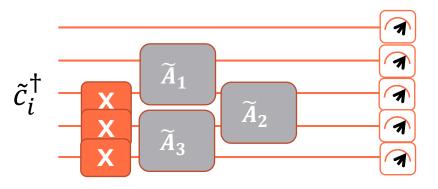


## **Beyond Hartree-Fock?**

### In original basis:



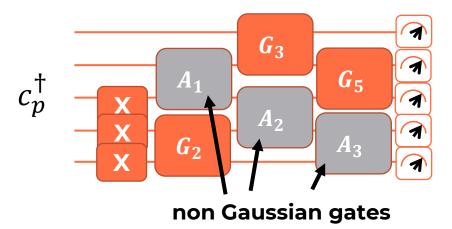
Can we find a (the?) basis that most simplifies the circuit?





### **Beyond Hartree-Fock?**

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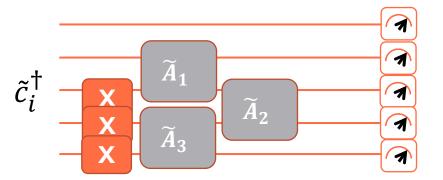


#### The natural orbital basis

### The basis with fewest Slater determinants, hence shortest circuit!

How to compute it?

Can we find a (the?) basis that most simplifies the circuit?



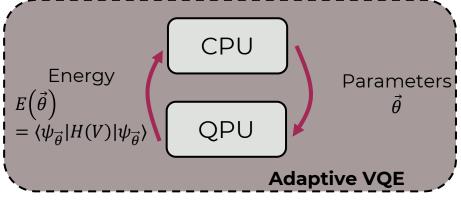
Diagonalize

$$D_{pq} = \langle \Psi | c_p^{\dagger} c_q | \Psi \rangle = V_{pi} n_i V_{iq}^{\dagger}$$

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Besserve, TA, PRB '22 Besserve, Ferrero, TA, 2406.14170

 $|\Psi\rangle$  is unknown! Determine RDM iteratively

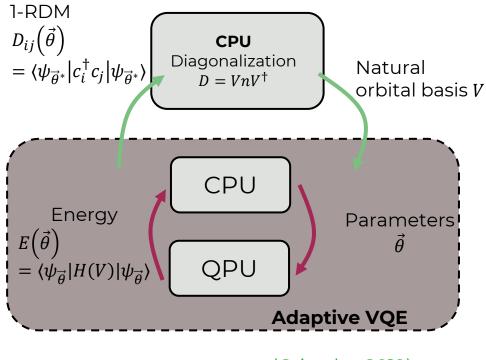


(Grimsley 2019)



Besserve, TA, PRB '22 Besserve, Ferrero, TA, 2406.14170

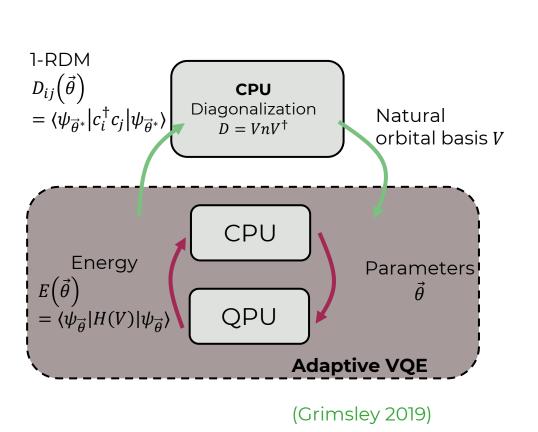
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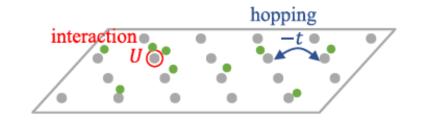


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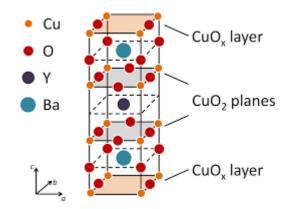


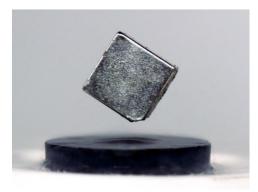
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Application: **Hubbard model** (here N=2 sites):



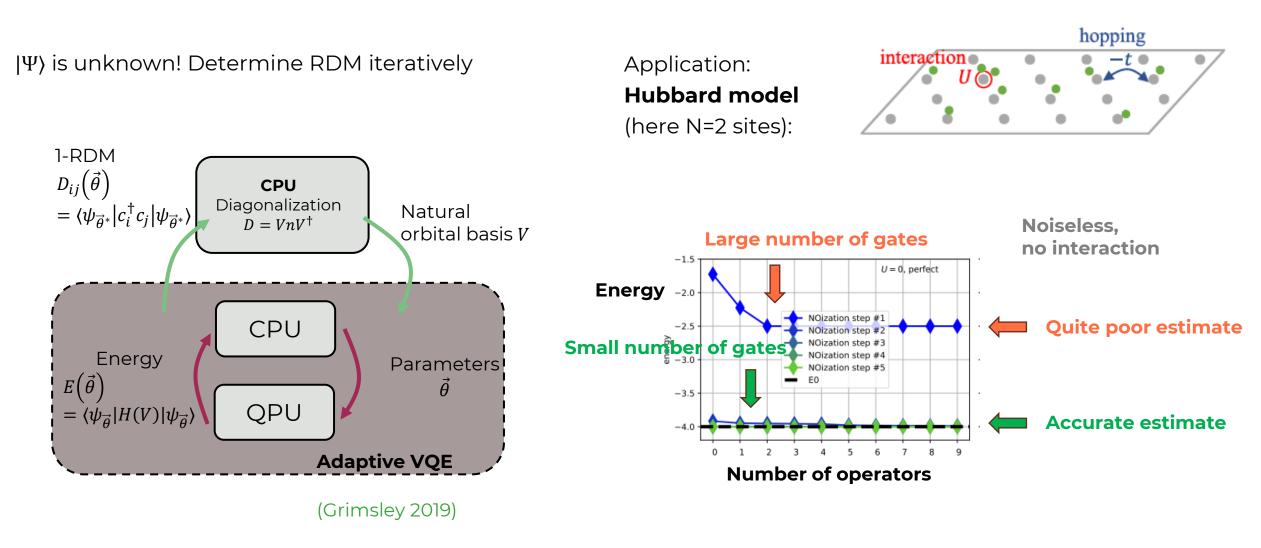
Simplest model for high-temperature superconductors





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Besserve, TA, PRB '22 Besserve, Ferrero, TA, 2406.14170



One method to reduce sensitivity to decoherence.

Still many issues with VQE (even without noise!)



One method to reduce sensitivity to decoherence.

### Still many issues with VQE (even without noise!)

- Measurement problem:  $\langle \psi_{\theta} | H | \psi_{\theta} \rangle$  known only up to statistical error

$$\Delta E \approx \frac{\|H\|_1}{\sqrt{N_{\text{samples}}}}$$



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mHa  $\longrightarrow \Delta E \approx \frac{\|H\|_1}{\sqrt{N_{\text{samples}}}}$  Ha

=> Lots of samples (days/months)

(Wecker 2017)



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(Wecker 2017)

• Barren plateau problem (McClean 2018)

$$E(\theta)$$

$$\sigma(E) \sim \frac{1}{2^n}$$

#### Ways out?

- Clever initialization
- Change way of optimizing
- (etc)

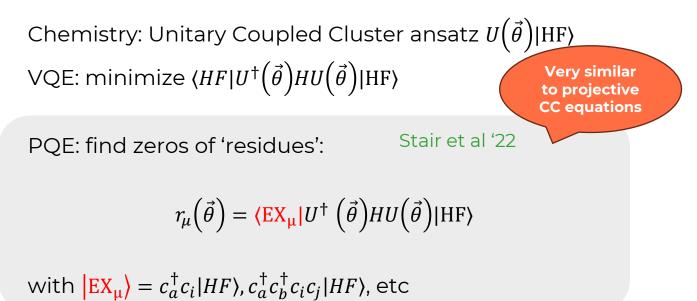
# Find zeroes instead of minimizing: the projective quantum eigensolver (PQE)

Chemistry: Unitary Coupled Cluster ansatz  $U(\vec{\theta})|\text{HF}\rangle$ VQE: minimize  $\langle HF|U^{\dagger}(\vec{\theta})HU(\vec{\theta})|\text{HF}\rangle$ 

PQE: find zeros of 'residues': Stair et al '22

 $r_{\mu}\left(\vec{\theta}\right) = \langle \mathbf{E}\mathbf{X}_{\mu} | U^{\dagger}\left(\vec{\theta}\right) H U\left(\vec{\theta}\right) | \mathrm{HF} \rangle$ 

with  $|\mathbf{E}\mathbf{X}_{\mu}\rangle = c_a^{\dagger}c_i|HF\rangle$ ,  $c_a^{\dagger}c_b^{\dagger}c_ic_j|HF\rangle$ , etc



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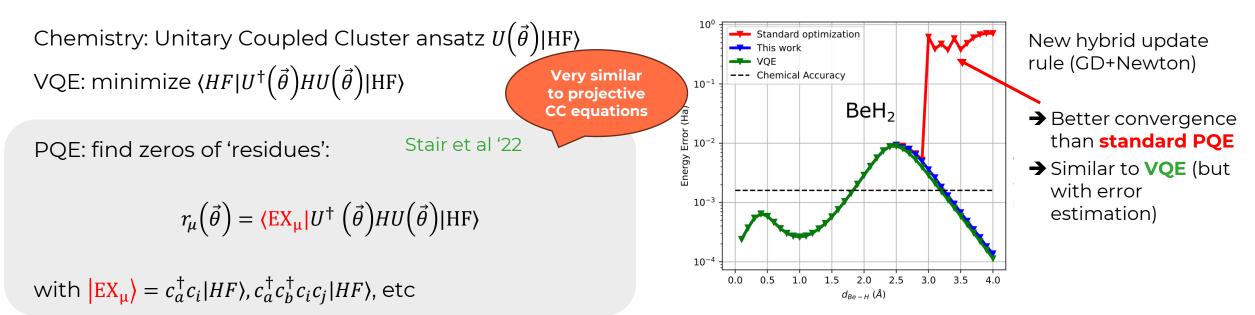
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Root finding: Newton-Raphson algorithm

- Convergence guarantees! (Newton-Kantorovitch theorem)
- Residues -> upper bound energy error (Temple inequality)

Plazanet, TA, 2410.15129

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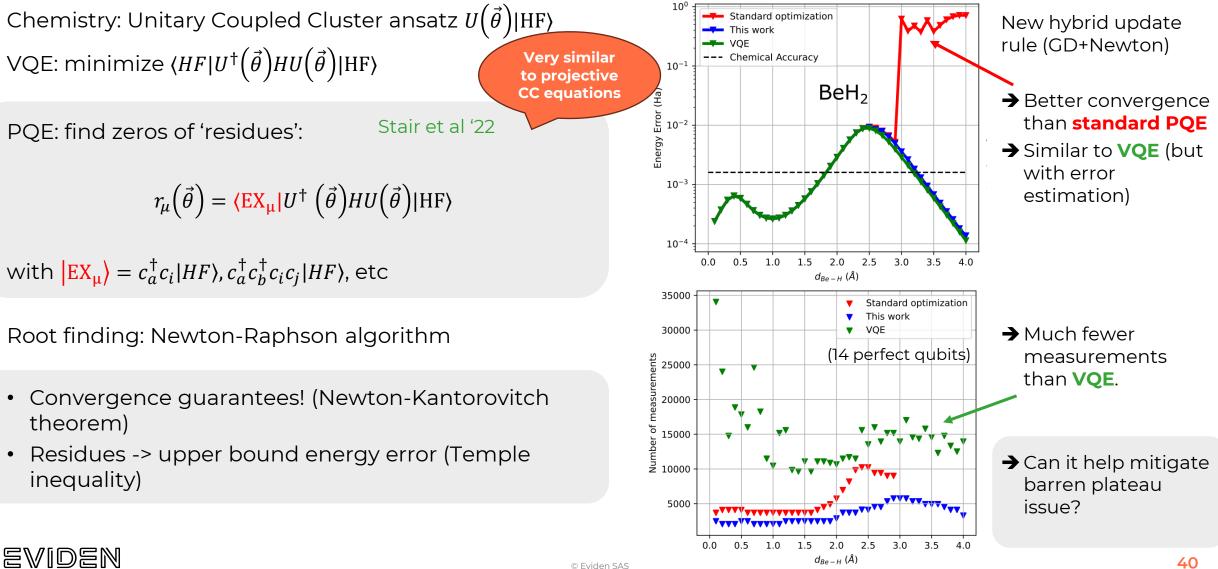


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Plazanet, TA, 2410.15129



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# Outline



Can we shorten circuits?



Can we even avoid fermionic rules? Hubbard physics with Rydberg processors

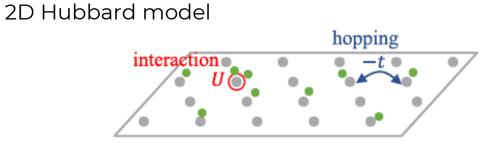


Hybridizing tensor networks and quantum algorithms

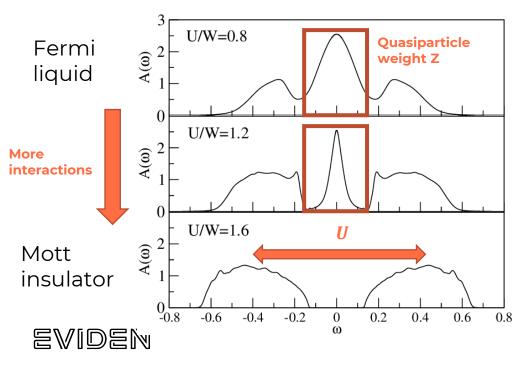


Could we use quantum noise to our advantage?

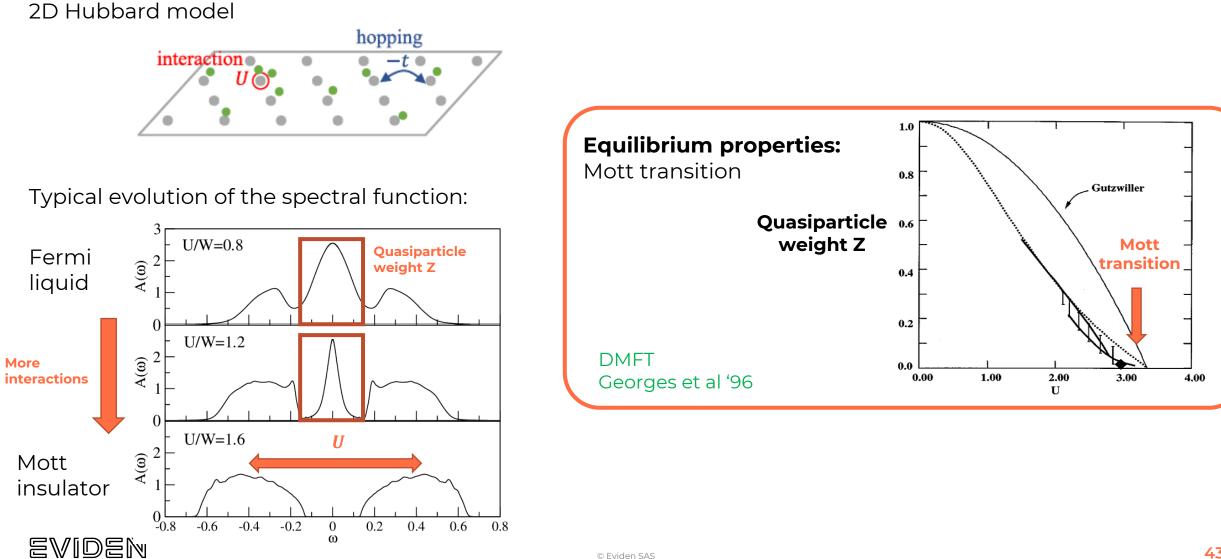
### Mott physics in the Hubbard model



Typical evolution of the spectral function:



### Mott physics in the Hubbard model



de' Medici 2005

Goal: avoid overhead of fermion-to-qubit translation

$$H = -t \sum_{\langle ij \rangle \sigma} c^{\dagger}_{i\sigma} c_{j\sigma} + U \sum_{i} n_{i\uparrow} n_{i\downarrow}$$

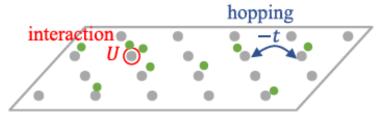
"Slave-spin theory": decompose



Michel, Henriet, Domain, Browaeys, TA, PRB 24



#### Interacting electrons (Hubbard model)





de' Medici 2005

Hassan 2010

Rüegg et al 2010

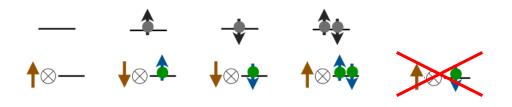
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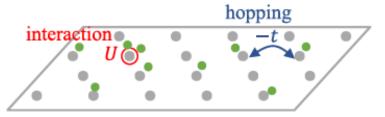
Larger Hilbert space: only a smaller subspace is physical:



Michel, Henriet, Domain, Browaeys, TA, PRB 24



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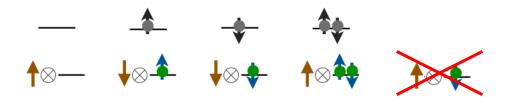
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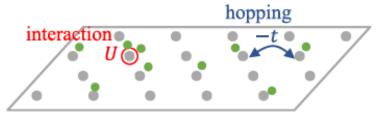
Approximation: Mean-field decoupling:

 $Z_i Z_j f_{i\sigma}^{\dagger} f_{j\sigma} \approx \langle Z_i Z_j \rangle f_{i\sigma}^{\dagger} f_{j\sigma} + Z_i Z_j \langle f_{i\sigma}^{\dagger} f_{j\sigma} \rangle + const.$ 

Michel, Henriet, Domain, Browaeys, TA, PRB 24



#### Interacting electrons (Hubbard model)





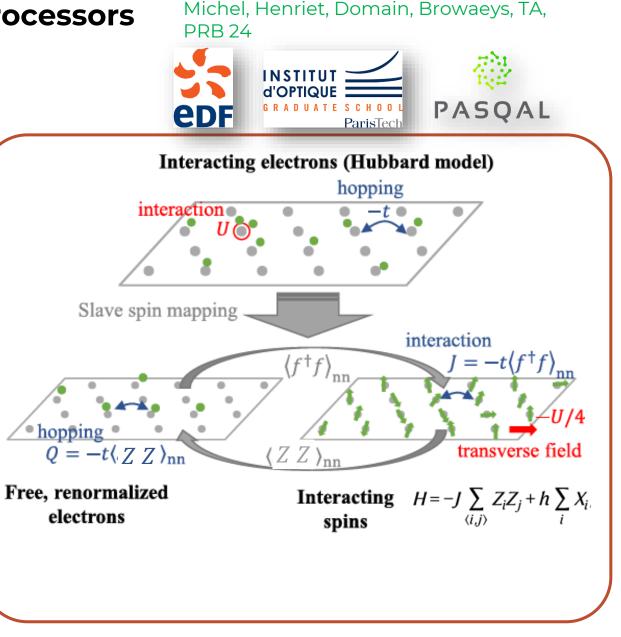
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"Slave-spin theory": decompose  $c_{i\sigma}^{\dagger} = Z_i f_{i\sigma}^{\dagger}$  de' Medici 2005 Rüegg et al 2010 Hassan 2010

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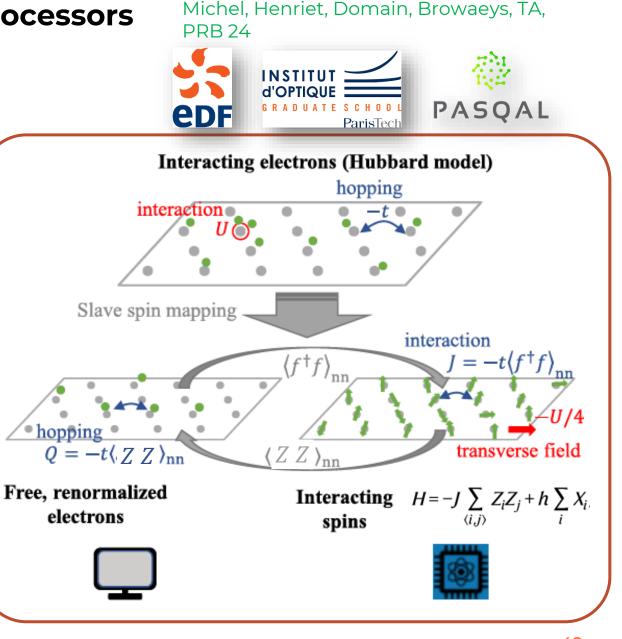
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Effective model: Transverse Field Ising model (TFIM):

$$H_{\mathrm{s}}^{\mathcal{C}} = \sum_{i,j\in\mathcal{C}} J_{ij} S_i^z S_j^z + \frac{U}{4} \sum_{i\in\mathcal{C}} S_i^x + \sum_{i\in\mathcal{C}} h_i S_i^z,$$

... very close to Rydberg atom Hamiltonian!

$$\hat{H}_{\mathrm{Rydberg}} = \sum_{i \neq j} \frac{C_6}{|\mathbf{r}_i - \mathbf{r}_j|^6} \hat{n}_i \hat{n}_j + \frac{\hbar \Omega(\tau)}{2} \sum_i \hat{S}_i^x - \hbar \delta(\tau) \sum_i \hat{n}_i,$$

Review: Browaeys & Lahaye 2020

Michel, Henriet, Domain, Browaeys, TA, PRB 24

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- Optimize atoms positions to reproduce  $J_{ij}$
- Check robustness to decoherence



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#### Rydberg algorithmics:

• Equilibrium: annealing algorithm to prepare ground state



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$$\hat{H}_{\text{Rydberg}} = \sum_{i \neq j} \frac{C_6}{|\mathbf{r}_i - \mathbf{r}_j|^6} \hat{n}_i \hat{n}_j + \frac{\hbar \Omega(\tau)}{2} \sum_i \hat{S}_i^x - \hbar \delta(\tau) \sum_i \hat{n}_i,$$

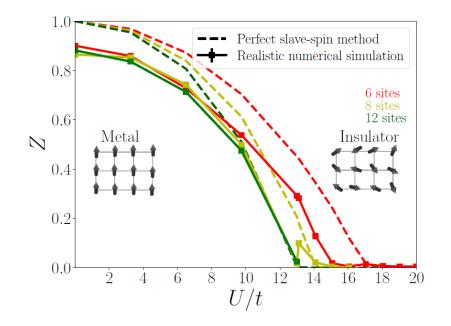
Review: Browaeys & Lahaye 2020

#### Main challenges:

- Optimize atoms positions to reproduce  $J_{ij}$
- Check robustness to decoherence

#### Rydberg algorithmics:

• Equilibrium: annealing algorithm to prepare ground state



Michel, Henriet, Domain, Browaeys, TA, PRB 24

Effective model: Transverse Field Ising model (TFIM):

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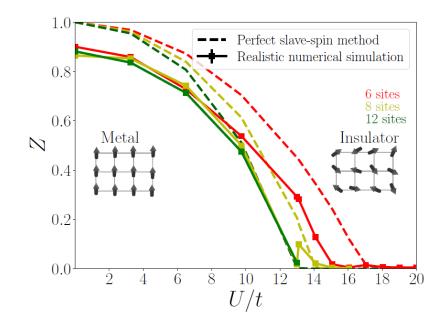
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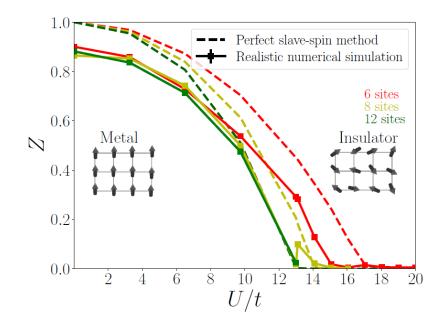
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#### Ongoing experimental realization @Pasqal!

# EVIDEN

# Outline



Can we shorten circuits?



Can we even avoid fermionic rules? Hubbard physics with Rydberg processors



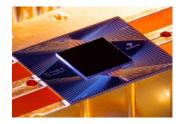
Hybridizing tensor networks and quantum algorithms Jump-starting quantum computations



Could we use quantum noise to our advantage?

#### Google supremacy?

Sycamore, 53 qubits



(Arute et al '19)

Sampling from random circuits

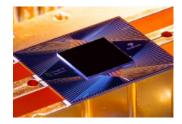
200 seconds! (and F = 0.2%!)

classical emulation: 10,000 years



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Exp.	1 amp.	1 million noisy samples		
	FLOPs	FLOPs	XEB fid.	Time
SYC-53 [9]	$6.44\cdot10^{17}$	$2.60\cdot 10^{17}$	$2.24\cdot 10^{-3}$	$6.18~{ m s}$

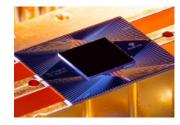
Morvan et al '23

What happened? TA et al, PRXO 2023



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#### IBM useful advantage?

Eagle, 127 qubits

(Kim et al '23)

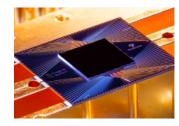
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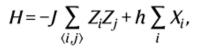
Morvan et al '23

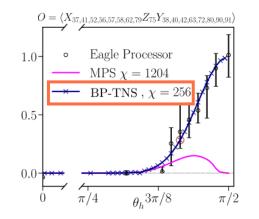
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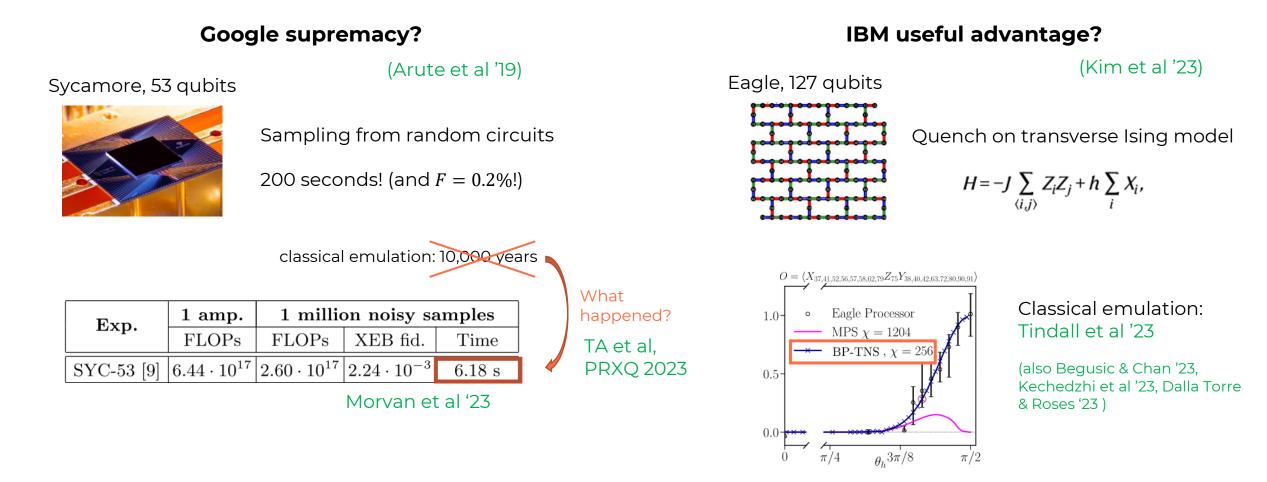




Eagle, 127 qubits

#### Classical emulation: Tindall et al '23

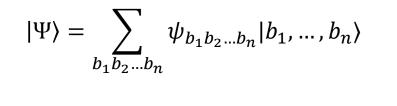
(also Begusic & Chan '23, Kechedzhi et al '23, Dalla Torre & Roses '23 )



#### Method to beat the exponential wall?



Generic wavefunction:

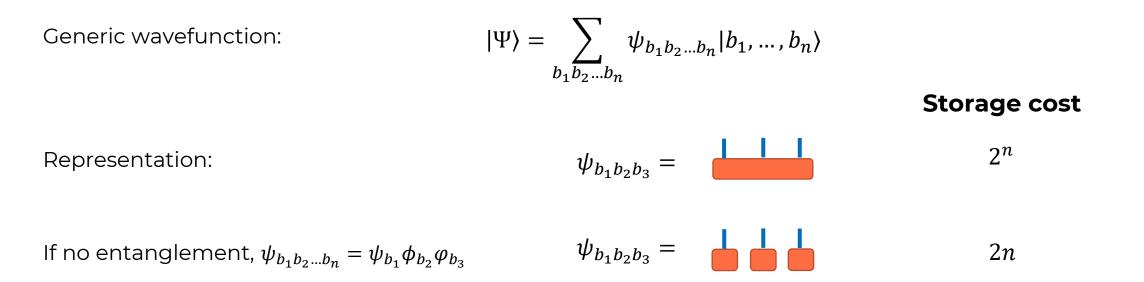


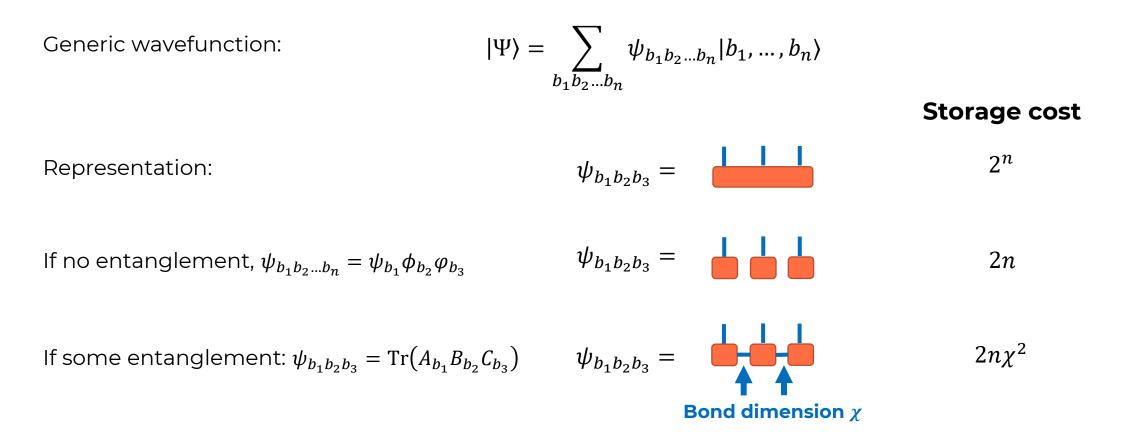
Representation:

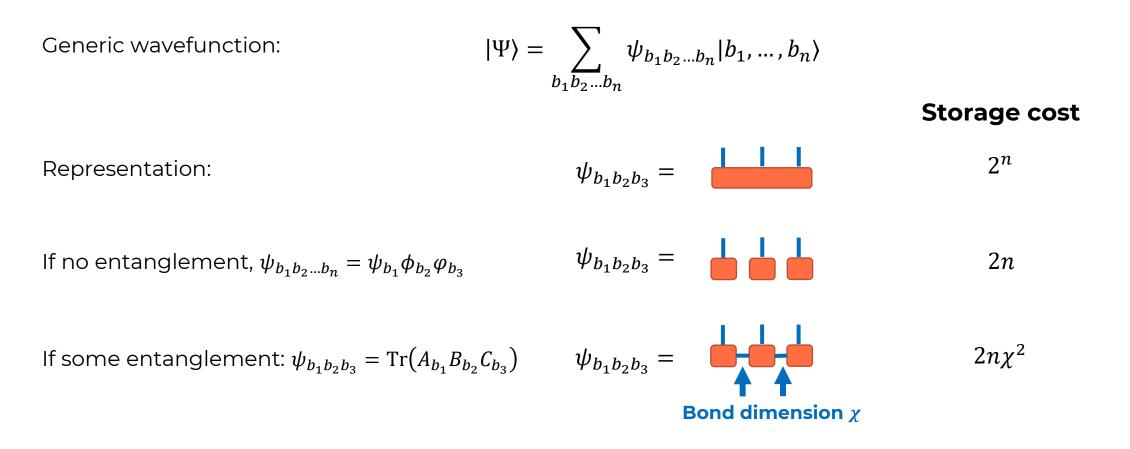


Storage cost









No free lunch: if entanglement S, need

 $\chi \gtrsim 2^S$ 

#### EVIDEN

Tensor network (TN) showstopper:

Need  $\chi \gtrsim 2^S$ 

with S: entanglement entropy

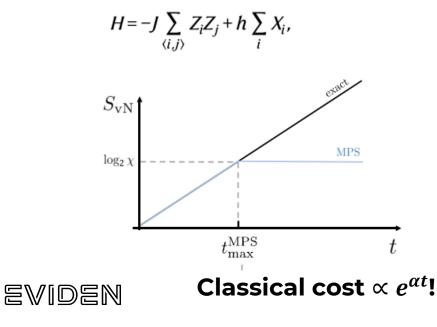


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#### Hard example: quench of Ising model



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Quantum computation (QC) showstopper:

Fidelity reduction  $F \propto e^{-pN_g}$ 

Large  $N_{\rm g}$  for accurate Suzuki-Trotter time evolution:

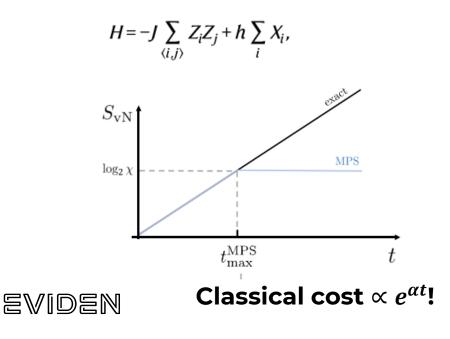
$$e^{-iHt} = \prod_{k}^{N_t} \prod_{\langle ij \rangle} R_{zz}(ij) \prod_{i} R_X(i) + O\left(\frac{t}{N_t}\right)^2$$

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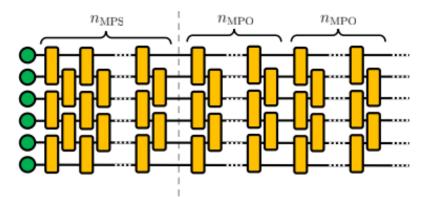
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#### Two key ideas:

⇒Push TN computation to its limit and take over with QC

 $\Rightarrow$ Use TN techniques to compress quantum circuits

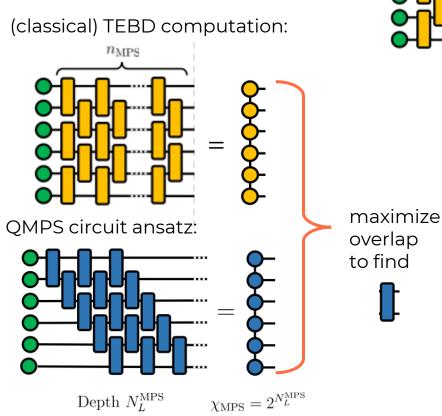
Formal target: fine-grained Suzuki-Trotter time evolution:

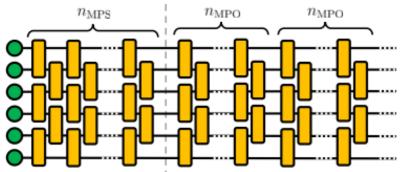


Anselme-Martin, TA et al, PRA 24 See also Causer et al '23

Too many steps for TEBD (limited RAM) Too many steps for QC (limited coherence)

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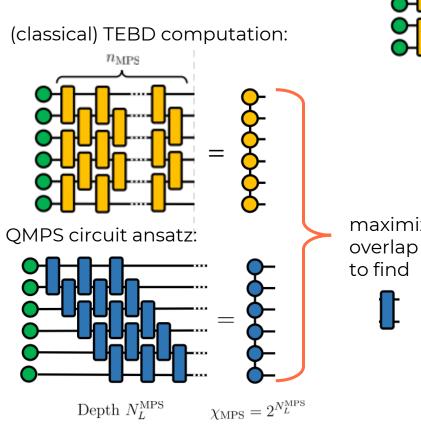


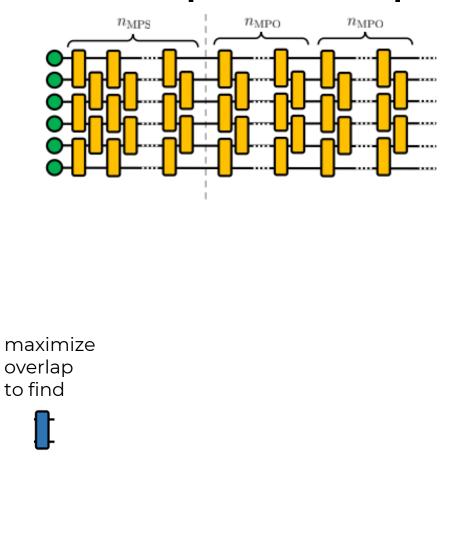


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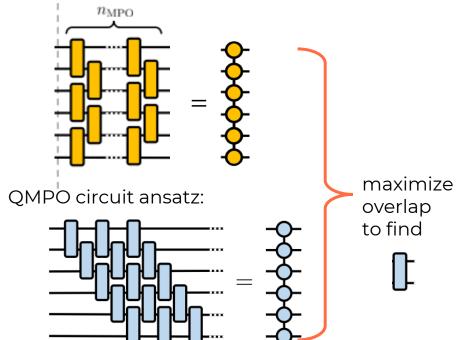




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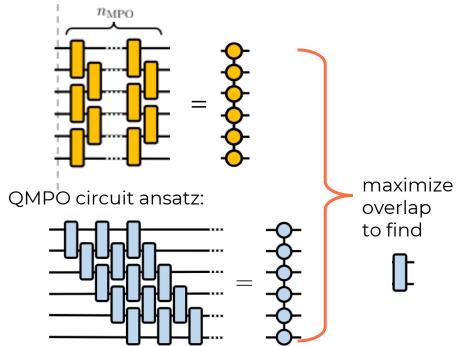
#### (classical) TEBD computation:

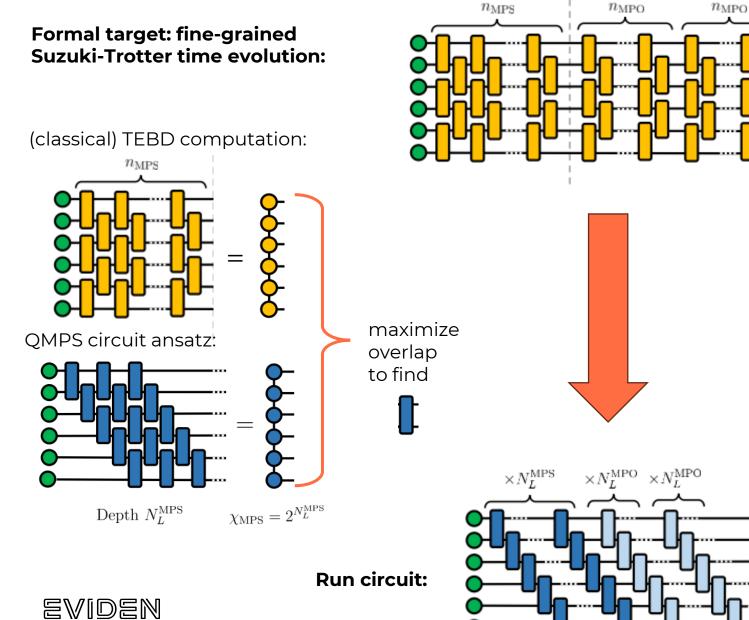


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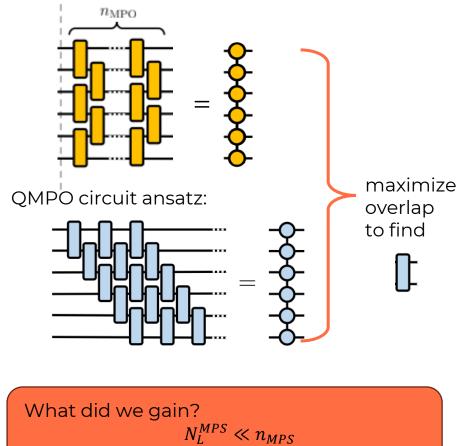
#### Hybridizing tensor networks and quantum computation

 $n_{\rm MPS}$ 

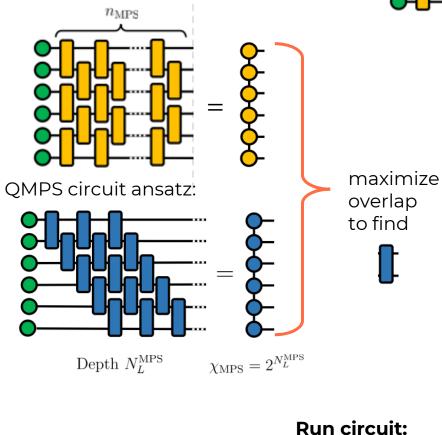
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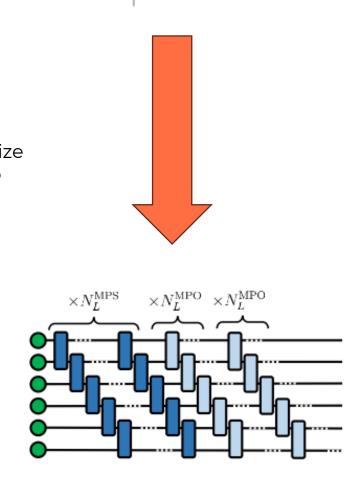
 $N_{I}^{MP0} \ll n_{MP0}$ 



Formal target: fine-grained

(classical) TEBD computation:

Suzuki-Trotter time evolution:



 $n_{\rm MPO}$ 

 $n_{\text{MPO}}$ 

EVIDEN

# Experimental proof of concept on IBM quantum computers

Look at magnetization for quenched Ising

 $H = -J \sum_{\langle i,j \rangle} Z_i Z_j + h \sum_i X_i,$ 

- 10 spins/qubits (toy model)
- Assume fixed RAM, hence max bond dim
   ⇒max time to keep MPS 'exact'

Anselme-Martin, TA et al, PRA 24 See also Causer et al '23

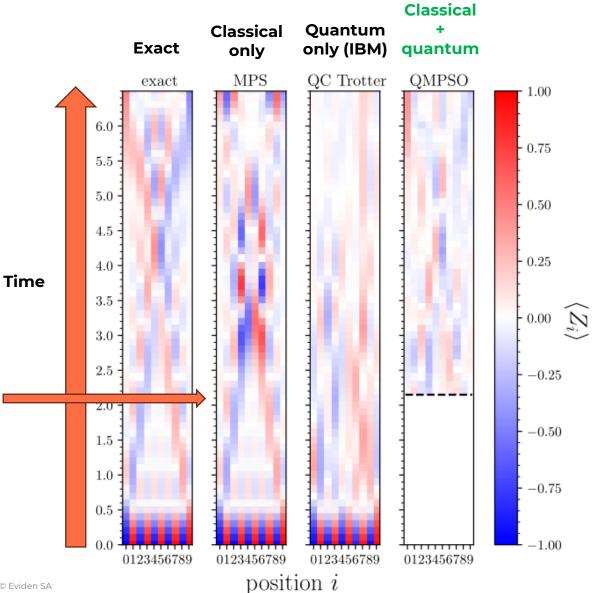
#### **Experimental proof of concept on IBM** quantum computers

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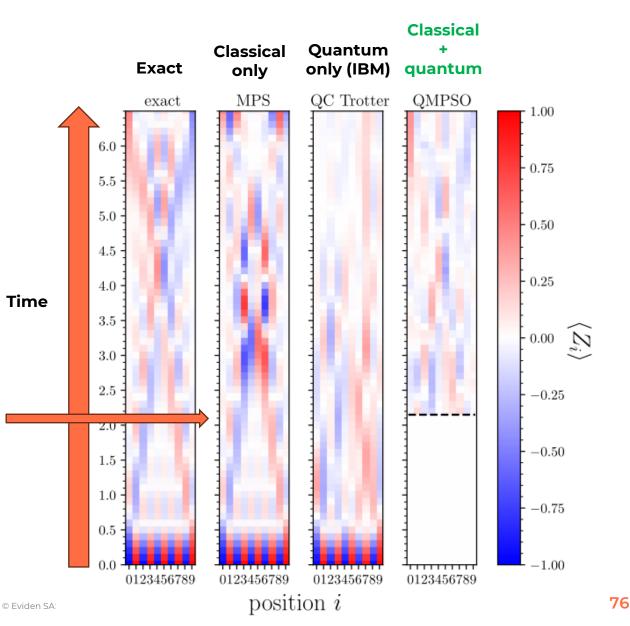
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- Assume fixed RAM, hence max bond dim ⇒max time to keep MPS 'exact'
- Hybrid approach outperforms both others

#### Only proof of concept!

- Artificially small RAM budget: realistic budget would make it hard for QC to compete
- True challenge for TN: 2D (but same ideas apply)

Anselme-Martin, TA et al, PRA 24 See also Causer et al '23





#### **Conclusions of Part 3**

Double role of tensor networks:

- Often the most advanced classical algorithm:
   a yardstick for quantum advantage

   (deflate quantum advantage claims)
- Can jump-start a quantum computation! (Here, limited to 1D TN... true challenge: 2D)

#### **Conclusions of Part 3**

Double role of tensor networks:

- Often the most advanced classical algorithm:
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   (deflate quantum advantage claims)
- Can jump-start a quantum computation! (Here, limited to 1D TN... true challenge: 2D)

Not mentioned here... a third role:

- Tensor networks are also powerful tools to emulate execution of quantum circuits!
- Help interpret results of QCs with 100-1000 noisy qubits!

Key advantage: decoherence reduces entanglement S... and recall:  $\chi \gtrsim 2^{S}$ 

 $\Rightarrow$ Noisy QCs are easier for TNs!

 $\Rightarrow$  Eviden develops QC emulators with 100s qubits!

See Müller, TA, Bertrand, 2403.00152

### EVIDEN

#### Outline



Can we shorten circuits?



Can we even avoid fermionic rules? Hubbard physics with Rydberg processors



Hybridizing tensor networks and quantum algorithms Jump-starting quantum computations



Could we use quantum noise to our advantage?

#### Can we use qubit noise to simulate a thermodynamical bath?

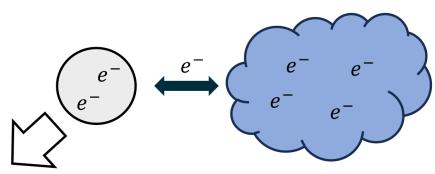
Bertrand, Besserve, Ferrero, TA, in preparation

# 

Dissipative processes:

- Amplitude damping  $\rightarrow S^- = |0\rangle\langle 1|$
- Dephasing  $\rightarrow Z$

#### Many-body system + thermodynamic bath



Dissipative processes:

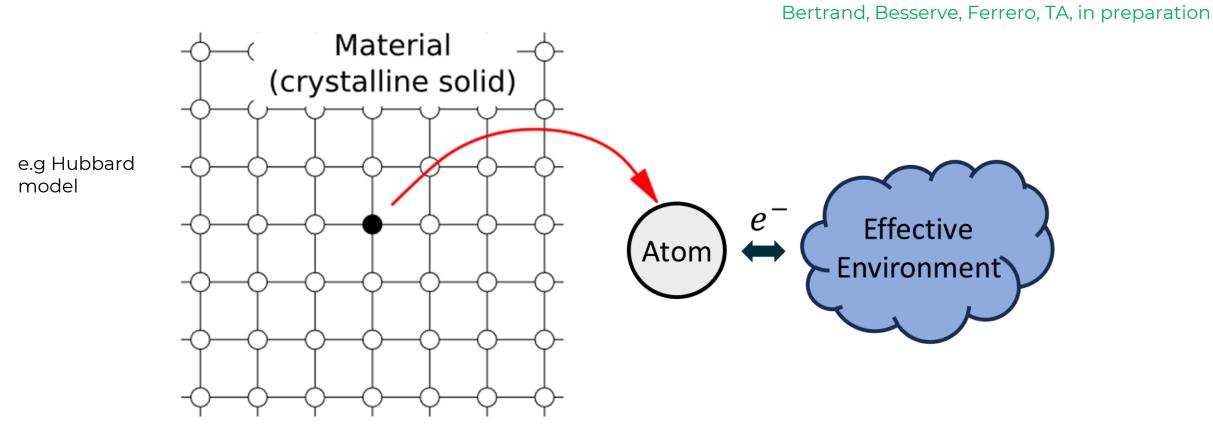
- Creation of particle  $\rightarrow c^{\dagger}$
- Annihilation of particle  $\rightarrow c$



formally the same

#### Dynamical mean field theory, an ideal playground

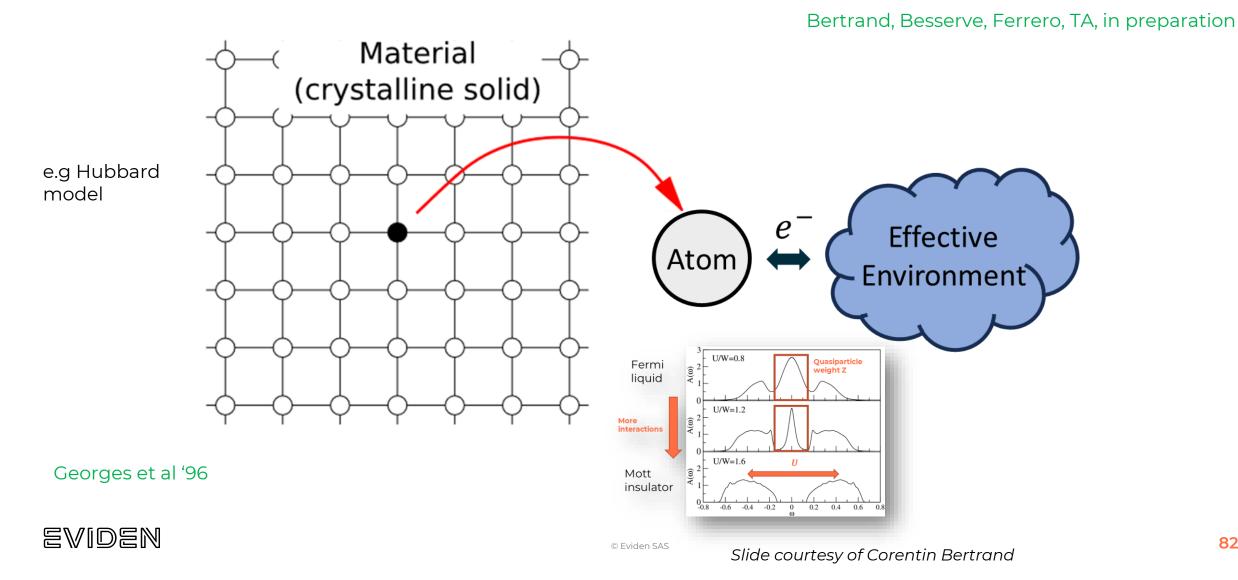
From a lattice problem to an atomic problem coupled to a bath



Georges et al '96

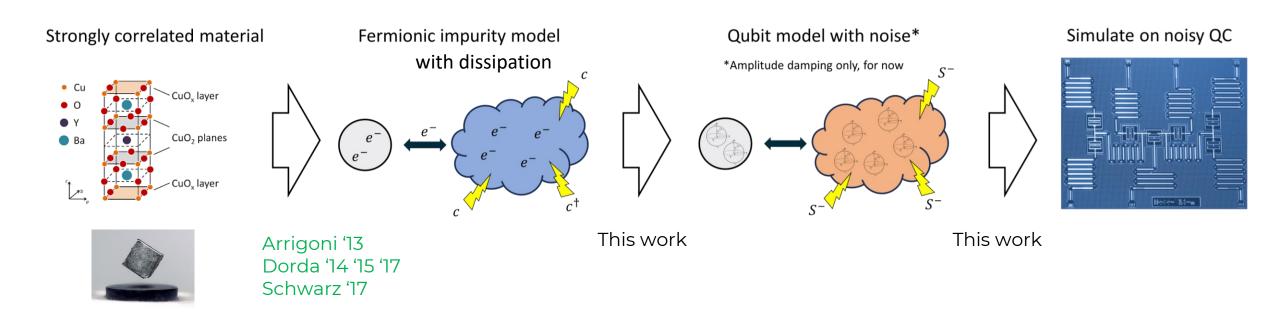
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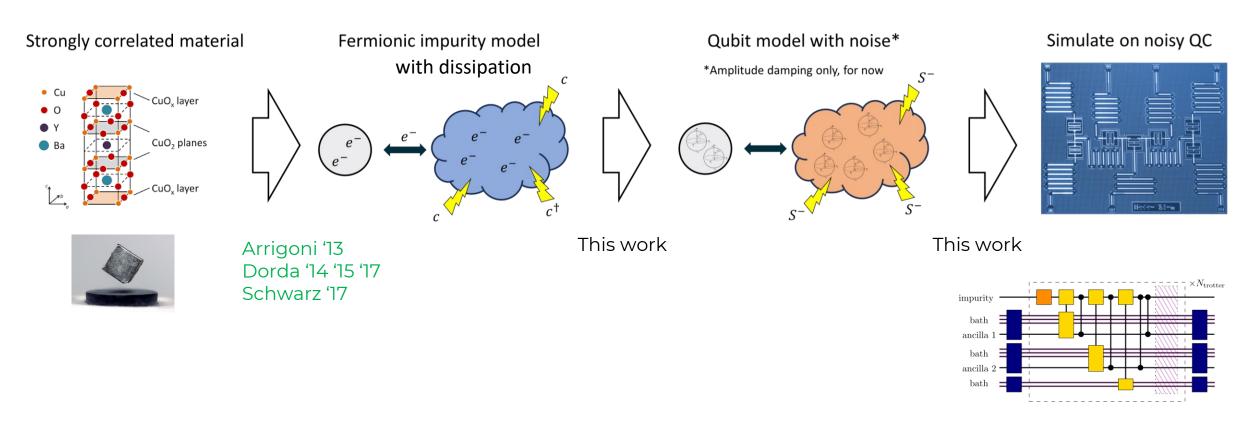
82

#### A workflow to leverage noisy qubits





#### A workflow to leverage noisy qubits





#### What is the advantage of noise?

Coupling to a dissipative bath

• Alleviates **finite-size effects** (dissipation stems from large systems):

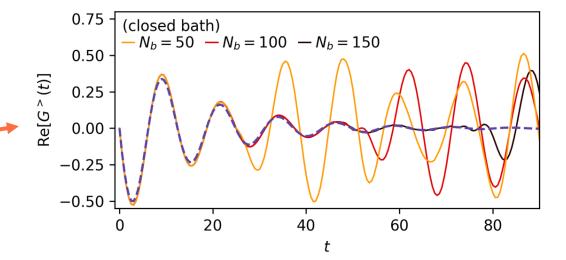


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Coupling to a dissipative bath

• Alleviates **finite-size effects** (dissipation stems from large systems):

✓ Can reach longer times (smaller energies)

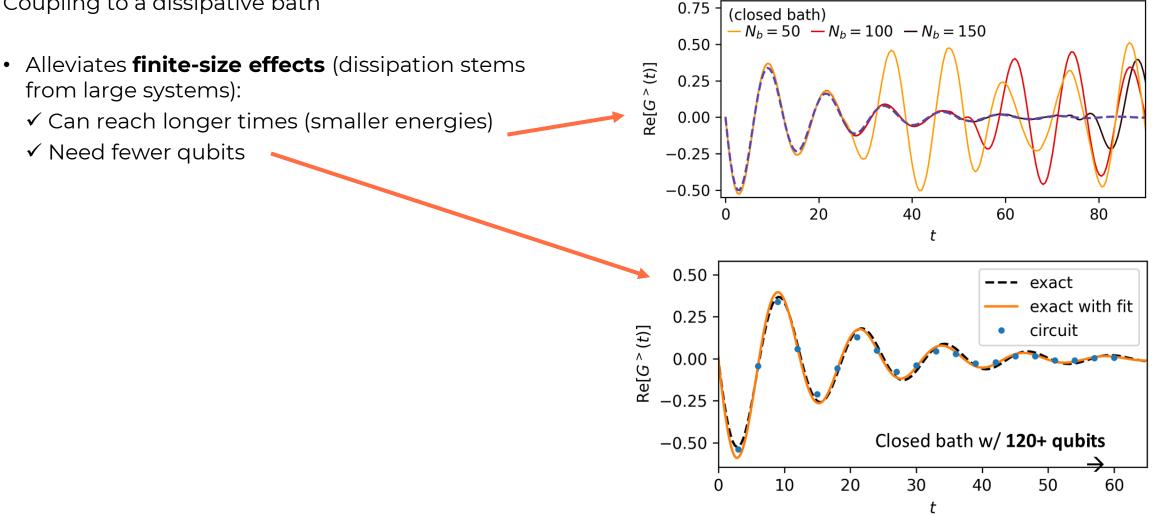


#### Green's function computation:

#### What is the advantage of noise?

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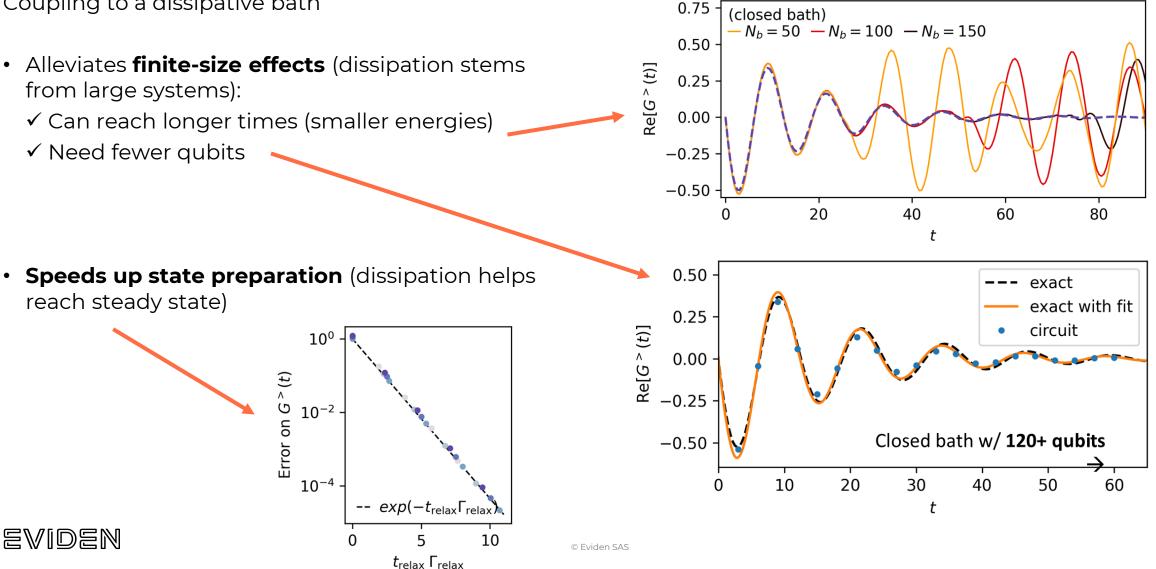


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#### What is the advantage of noise?

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## EVIDEN

## Conclusion

Today, many-body platforms with **100-1000** particles/qubits.



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- But quantum has decoherence...



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 $(\Leftrightarrow NISQ is for niche applications!)$ 

Crucial: smart combination with classical methods.



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## Can we use NISQ beyond quantum many-body dynamics (e.g ground state search)?

VQE or beyond?



#### EVIDEN

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## Crucial: smart combination with classical methods.

## Can we use NISQ beyond quantum many-body dynamics (e.g ground state search)?

#### VQE or beyond?



#### Today's examples:

- Shorter circuit with natural orbitals
- Better convergence properties of PQE than VQE?
- Slave-spin to short-circuit fermionic overhead
- MPS to jump start QC
- Use noise to our advantage?

#### EVIDEN



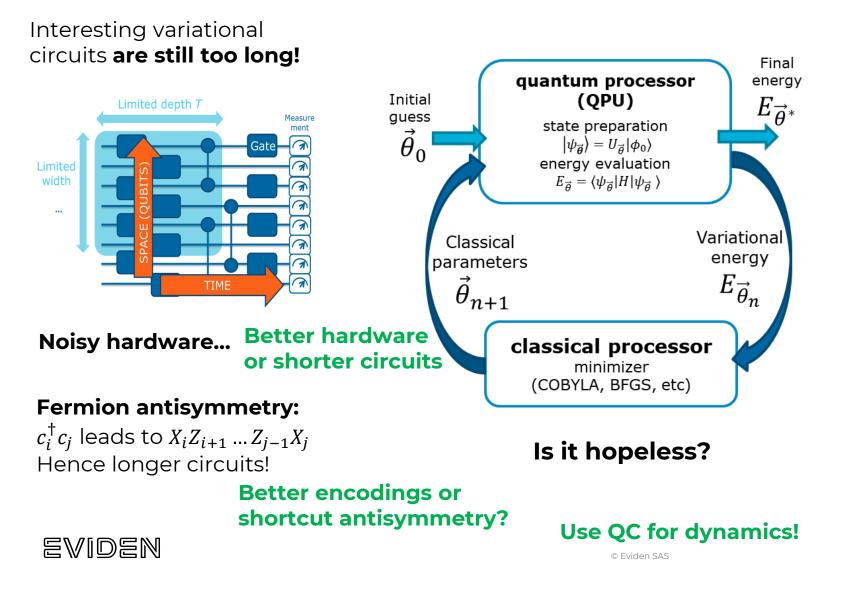
## Thanks

thomas.ayral@eviden.com

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#### Known issues with the variational quantum eigensolver



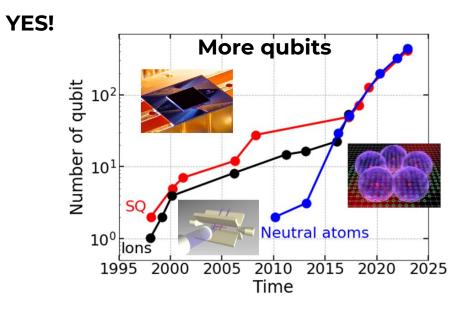
```
Measurement of \langle \psi_{\theta} | H | \psi_{\theta} \rangle:
statistical error \Delta E \approx \frac{\|H\|_1}{\sqrt{N_{\text{samples}}}}
Typically, \|H\|_1 = 10 Ha, \Delta E = 1mHa...
```

=> 10<sup>8</sup> samples / 10 kHz = 3 hours (x number of optimization steps!)

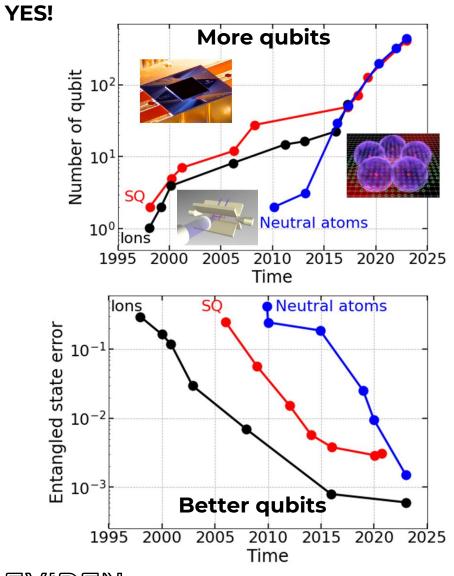
#### Don't measure $\langle \psi_{\theta} | H | \psi_{\theta} \rangle$ , just sample! Use VQE as input to LSQ algorithms

Barren plateau problem

 $E(\theta)$   $\theta$ Adaptive ansatz construction
Smarter initial starting point
Don't minimize  $E(\theta)$ (find zero residues (cf coupled graded)
97

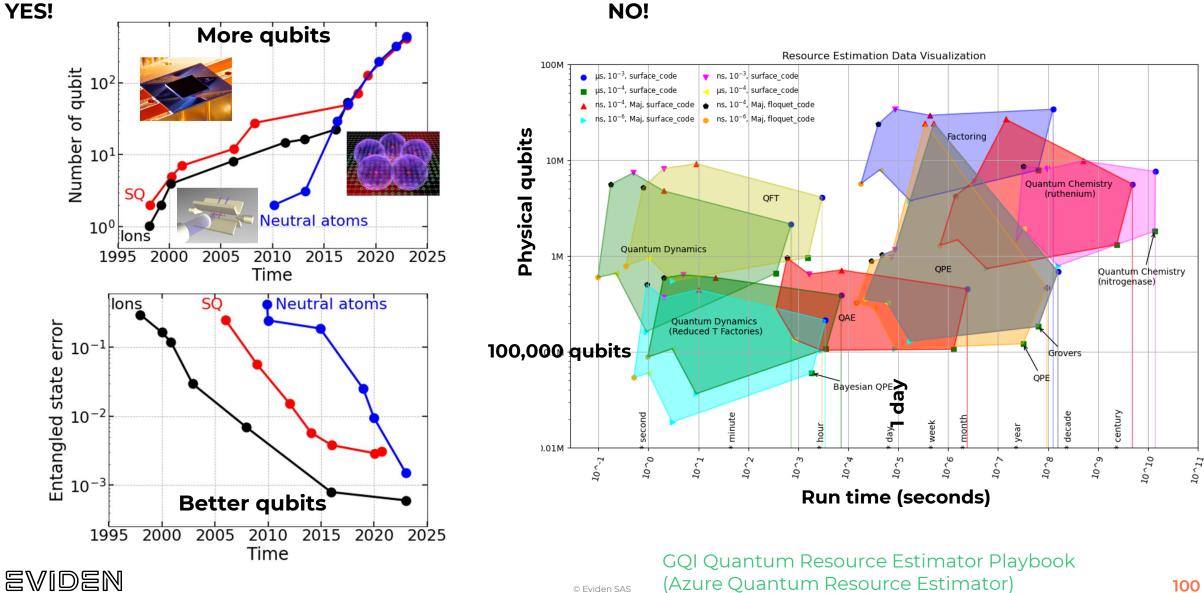


#### EVIDEN Courtesy of L.P Henry & L. Henriet @Pasqal

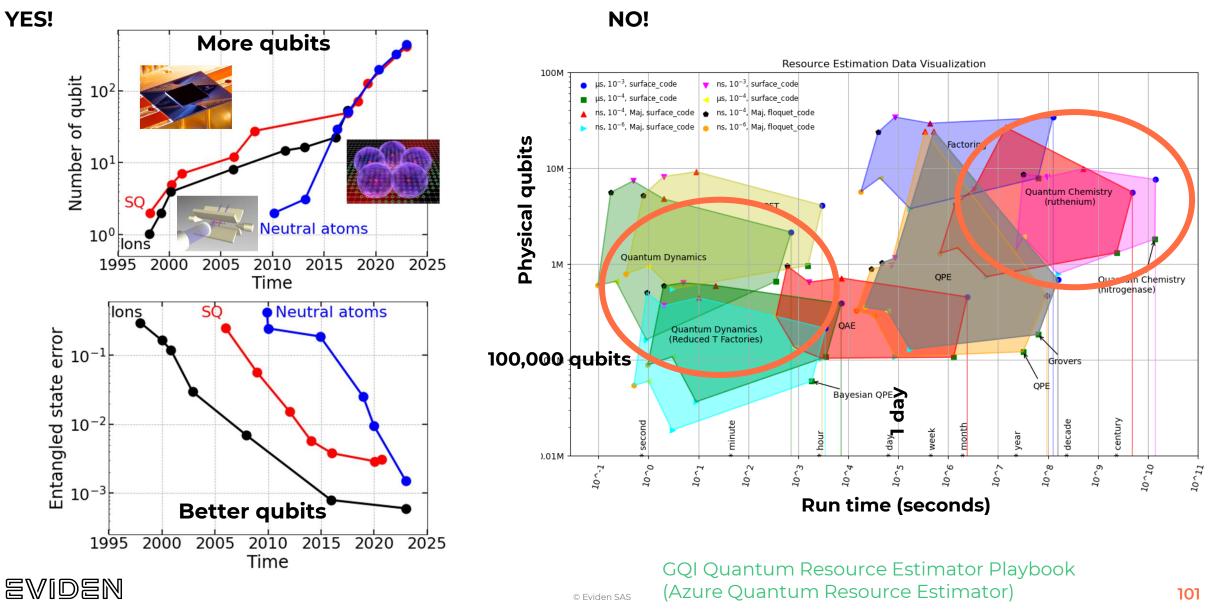


EVIDEN

Courtesy of L.P Henry & L. Henriet @Pasqal



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#### Even if we had enough good qubits...

Orthogonality catastrophe in quantum phase estimation

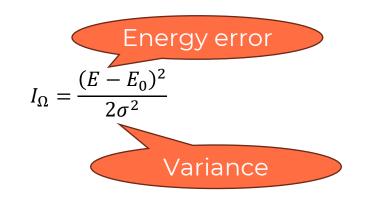
QPE run time:  $\propto 1/\Omega$ 

with  $\Omega$ : overlap of input state with solution

Estimate of  $\Omega$ :

 $\Omega \approx e^{-I_{\Omega}}$ 

with



Louvet, TA, Waintal, 2306.02620

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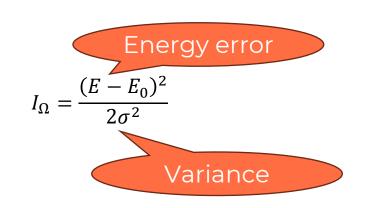
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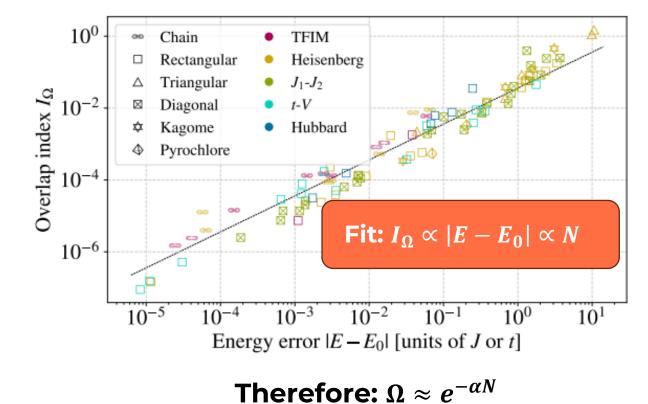
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#### Test on state-of-the-art classical methods:



- Better inputs?
- Better phase estimation algorithms?

