Variational low-depth preparation of correlated systems' ground states with the natural-orbitalization algorithm QCMB workshop

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# 01. Strongly-correlated materials: what and why



# Strongly-correlated materials

#### Or when electrons see each other and exotic behaviours emerge

Materials for which 1-particle theories fail

Perfect embodiments of the **particle/wave duality**: competition between electronic localization on atomic sites and tunneling

Minimal model : (Fermi-)Hubbard lattice

- Double occupancy of an atomic site comes with energy cost U
- Tunneling costs t

$$\widehat{H}_{Hub} = U \sum_{i} c_{i\uparrow}^{\dagger} c_{i\uparrow} c_{i\downarrow}^{\dagger} c_{i\downarrow} + t \sum_{ij\sigma} (c_{i\sigma}^{\dagger} c_{j\sigma} + h.c.)$$

→ Different behaviours depending on the ratio U/t, tunable by P, T, V



Study boosted by the discovery of 'high' Tc superconductors in the 80s



Phase diagram of a cuprate



# Strongly-correlated materials

#### How can we solve the Hubbard model?

Self-consistent mapping to an 'impurity' model describing  $N_c$  correlated sites embedded in a fermionic bath: (example:  $N_c$  =4)



Hamiltonian representation:  $\widehat{H}_{embedded} = \widehat{H}_{imp}^{\{c_{i\sigma}^{\dagger}, c_{i\sigma}\}}(U, t_{loc}) + V \sum_{ij\sigma} (c_{i\sigma}^{\dagger} a_{j\sigma} + h. c.)$ 

Requires to choose an embedding method (typically, Dynamical Mean-Field Theory [Georges, 1996]) + an *impurity solver* 

Impurity solving simpler, but definitely not simple:

- Bath truncation to a very low number of bath levels due to limited memory (Exact Diagonalization) OR
- Keep the bath infinite but get fermionic sign problem (Monte-Carlo sampling)

Quantum computing: Exponential speedup?

# Strongly-correlated materials Why could quantum computers help?

- N spinful sites  $\rightarrow 2^N$  amplitudes: exponential scaling of classical resources to store the wavefunction  $|\psi\rangle$
- Quantum computers: storage on N qubits
- Philosophy:



Feynman, 1982: 'Nature isn't classical, dammit, and if you want to make a simulation of nature, you'd better make it quantum mechanical, and by golly it's a wonderful problem, because it doesn't look so easy'



Google Sycamore superconducting quantum computer

 Domain still in its infancy → for now, test noisy quantum computing on easy, small problem instances to lay the ground for improvement



# **02.** Leveraging noisy quantum computers





# Limitations of current hardware

#### ...and how it translates in terms of possible circuit architectures

- Low width = qubit count (a few tens)
- Limited connectivity of the chip  $\rightarrow$  gate overhead due to operating swaps



 $\rightarrow$  Impose limitations on the depth of the circuit = gate count

Strategy: develop **hybrid** algorithms (quantum-classical), letting CPU do what they're good at! 7|11/24/2022 | Pauline Besserve | © Atos



# The Variational Quantum Eigensolver (VQE) algorithm

Or how to get away with small circuits by tuning th

Idea : Minimize energy over instances of a parametrized circuit [Peruzzo 2014] CPU and QPU work hand in hand





 $\theta^* = \operatorname{argmin} \langle \psi(\theta) | \widehat{H}_{embedded} | \psi(\theta) \rangle: | \psi(\theta^*) \rangle \approx | \psi_{GS} \rangle$ 



\$5-9

One must find a **trade-off** between expressivity and circuit depth



# State of the art A few baby steps, scalability issue

• 4-qubit circuits only, corresponding to 1 correlated site coupled to 1 bath site



- Not scalable to more sites
- Yet, it is crucial to increase the number of embedded impurity sites in the model → control parameter for the embedding error!
- Use small, very specific circuits → no variational ansatz to go to N<sub>c</sub>=2, except 'LDCA' [Dallaire-Demers 2019], which is too big to handle noise

Our work: towards a scalable hybrid framework to solve the Hubbard model





# Our proposal to increase $N_c$

#### An embedding method that accomodates hardware limitations

#### The Rotationally-Invariant Slave Boson method...

- Caps the number of qubits with #bath sites=#impurity sites
- Does not imply lengthy time evolution circuits: only monitor static correlators

 $D_{emb} = \langle \psi_{GS} \big| c_i^{\dagger} c_j \big| \psi_{GS} \rangle$ 

• Gives access to the low-energy physics: self-energy parametrized as

$$\Sigma(\omega) = \omega \left( 1 - \left( R^{\dagger} R \right)^{-1} \right) + R^{-1} \lambda \left( R^{\dagger} \right)^{-1}$$

R: quasiparticle weight renormalization,  $\lambda$ : energy shift





# Our proposal to increase $N_c$

A basis change to lower circuit requirements on the VQE ansatz

$$|\psi_{GS}\rangle = \sum_{j} a_{j} |\phi_{j}\rangle$$
  
Correlation entropy:  $S_{corr} = -\sum_{i} n_{i} \ln(n_{i})$ 

minimal in the 'Natural Orbitals' (NO) basis = diagonalization basis of  $D_{emb} = \langle \psi_{GS} | c_i^{\dagger} c_j | \psi_{GS} \rangle$ ,  $N \times N$  matrix

ightarrow minimal number of  $|\phi_j
angle$  in decomp. of  $|\psi_{GS}
angle$ 



Idea: working in NO avoids carrying out basis rotation on the chip



Circuit from 'Hartree-Fock on a superconducting qubit quantum computer' [Arute, 2020]

Spin-orbital occupations of the ground state in NO VS site-spin basis



# Our proposal to increase $N_c$

A basis change to lower circuit requirements on the VQE ansatz

'Natural Orbitals' (NO) basis = diagonalization basis of  $D_{emb} = \langle \psi_{GS} | c_i^{\dagger} c_j | \psi_{GS} \rangle$ :

$$V^{\dagger}D_{emb}V = diag(n_1, n_2, \dots, n_N)$$

Orbital rotation  $\tilde{c}^{\dagger}_{k} = \sum_{l} V_{lk} c_{l}^{\dagger}$ 

Transformation of the Hamiltonian  $\widetilde{H} = \sum (Vh_1V^{\dagger})_{pq} c_p^{\dagger} c_q + \sum (VVh_2V^{\dagger}V^{\dagger})_{pqrs} c_p^{\dagger} c_q c_r^{\dagger} c_s$ 



# Finding the optimal basis Topping VQE with Natural Orbitalization

Idea: Use approximate ground state to rotate basis, reach approximate NO basis iteratively



Hamiltonian-learning philoshophy as within Caroline Robin's algorithm, but state optimization separate from orbital basis optimization



ightarrow The NOization procedure works as expected.



# Results

#### Convergence of 2-impurity RISB - half-filled, paramagnetic model





The 'MREP' circuit we proposed and used.

#### 58 parameters

56 fSim gates, native in Google hardware 6 CNOT gates 6 one-qubit gates

LDCA: 112 CNOT gates, 148 parameters

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# Thank you!

#### Article available on arXiv at:



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