



Creating Materials & Energy Solutions  
U.S. DEPARTMENT OF ENERGY



IOWA STATE  
UNIVERSITY

# Gutzwiller method with machine learning and quantum computing

Yongxin Yao

2019-11-04

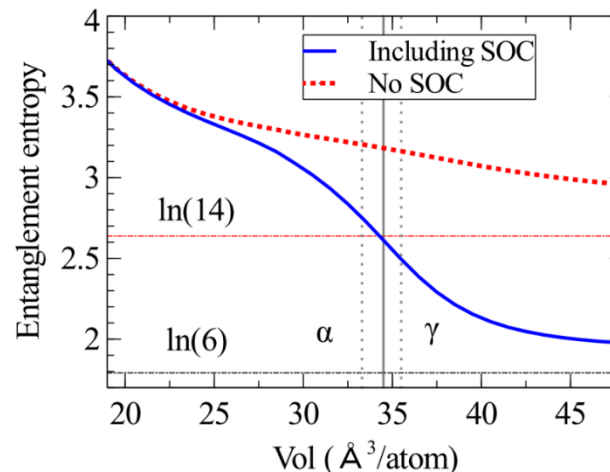
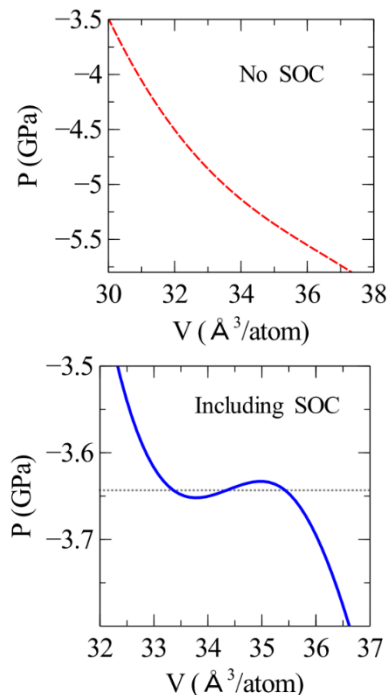
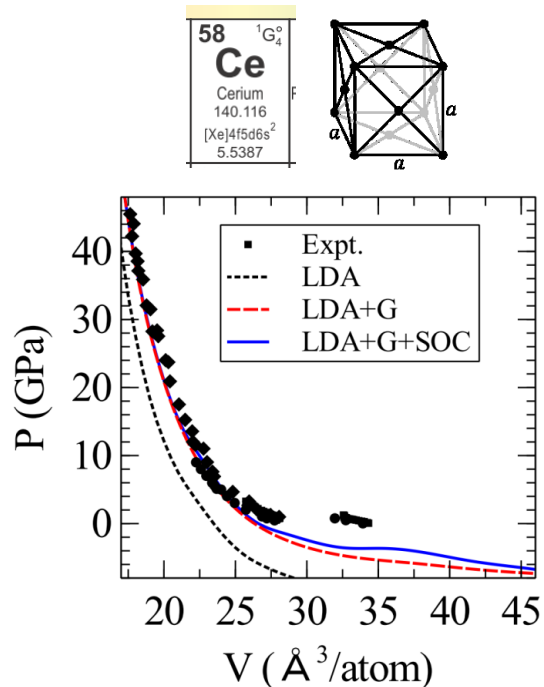
2019 Fall Workshop

Center for Computational Materials Sciences

# Outline

- Achievements of DFT+G calculations
- Analytical Jacobian of Gutzwiller solver:
  - a) Formulation
  - b) The significance
  - c) Implementation and benchmarking
- Hybrid quantum-classical simulation project

# Kondo physics and spin-orbit interaction governing Ce volume collapse transition

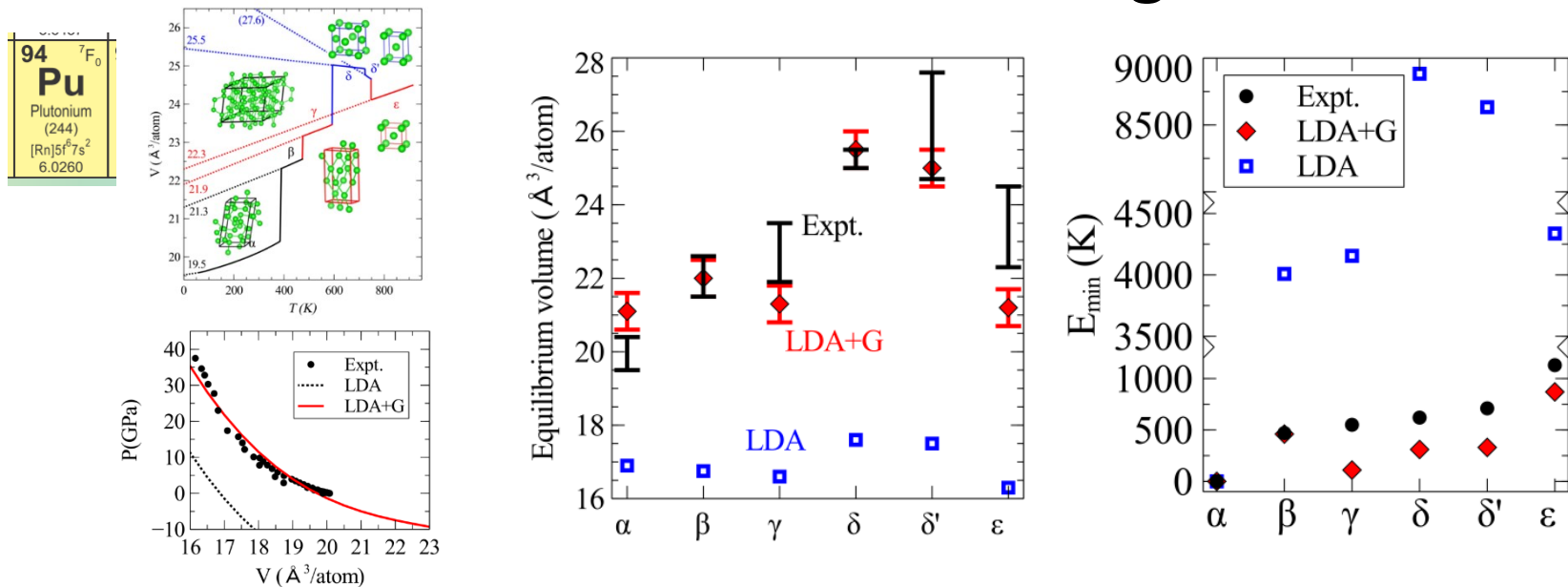


- Decent description of the equation of state
- Volume collapse transition only in the presence of spin-orbit interaction.
- A sharp crossover transition of the f-electron entanglement entropy

N. Lanatà, Y.-X. Yao\*, C.-Z. Wang, K.-M. Ho, J. Schmalian, K. Haule, and G. Kotliar, *Phys. Rev. Lett.* **111**, 196801 (2013).

N. Lanatà\*, Y.-X. Yao\*, C.-Z. Wang, K.-M. Ho, and G. Kotliar, *Phys. Rev. B (R)* **90**, 161104 (2014).

# Correlation effects balance competition between Peierls effect and Madelung interaction



- Remarkably improved descriptions of all six phases of Pu, including equation of state, equilibrium volumes, relative energies.
- Correlation effects are crucial to balance the competition between electrostatic Madelung effect (for closed pack structure) and Peierls effect (for low symmetry).

N. Lanatà\*, Y. -X. Yao\*, C.-Z. Wang, K.-M. Ho, and G. Kotliar, *Phys. Rev. X* 5, 011008 (2015).

# UO<sub>2</sub>: Selective Mott localized orbitals

## Mott localized orbitals:

$$|1\rangle \simeq 0.939 |\Gamma_8^{(1)}, 5/2, +\rangle + 0.343 |\Gamma_8^{(2)}, 7/2, -\rangle$$

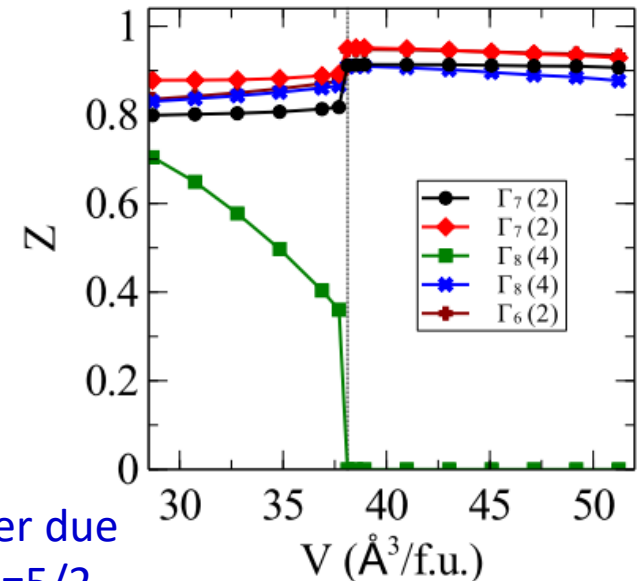
$$|2\rangle \simeq 0.939 |\Gamma_8^{(1)}, 5/2, -\rangle + 0.343 |\Gamma_8^{(2)}, 7/2, +\rangle$$

$$|3\rangle \simeq 0.939 |\Gamma_8^{(2)}, 5/2, +\rangle + 0.343 |\Gamma_8^{(1)}, 7/2, -\rangle$$

$$|4\rangle \simeq 0.939 |\Gamma_8^{(2)}, 5/2, -\rangle + 0.343 |\Gamma_8^{(1)}, 7/2, +\rangle$$

Mott localized states have considerably mixed  $J^2$  character due to the crystal field effect (not a simple picture of all the  $J=5/2$  orbitals localized).

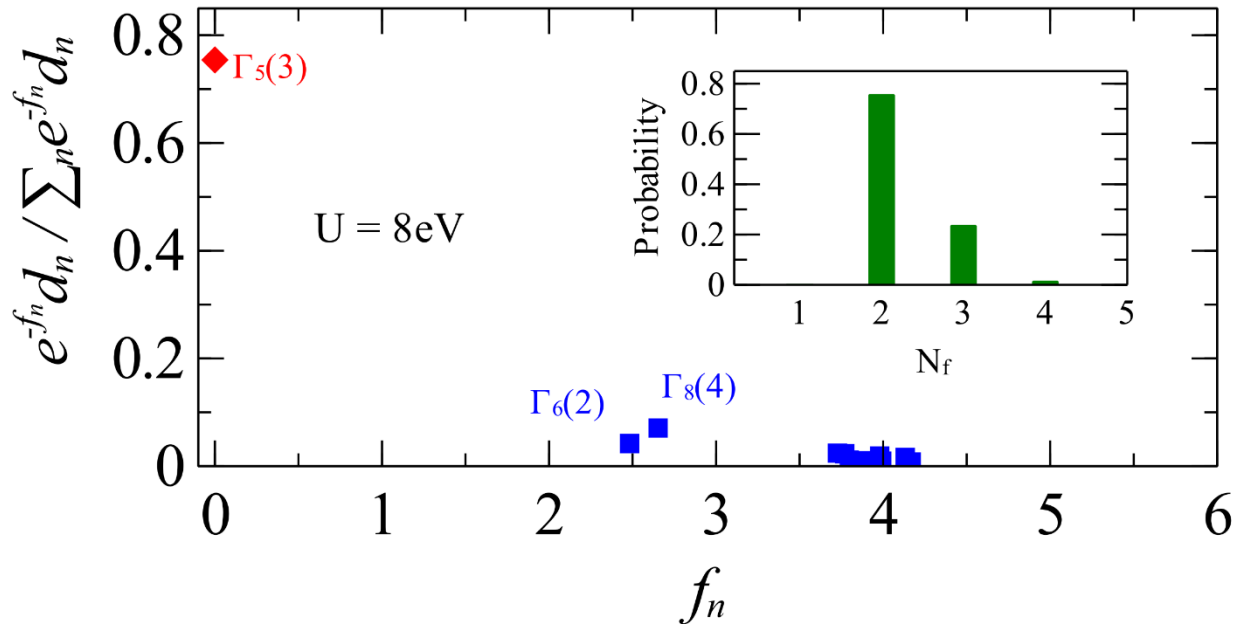
Z: Kinetic energy  
renormalization factor



Nicola Lanata\*, Yongxin Yao\*, Xiaoyu Deng, Vladimir Dobrosavljevic, and Gabriel Kotliar, *PRL* **118**, 126401 (2017)

# UO<sub>2</sub>: Multiplet structure

local reduced density matrix  $\hat{\rho}_f \equiv e^{-\hat{F}} / \text{Tr}[e^{-\hat{F}}]$

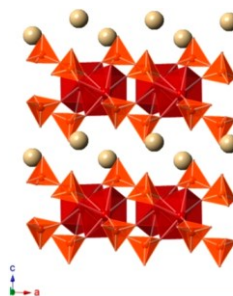


Most probable local configuration  $f=2$   $\Gamma_5$  triplet, consistent with experiment.

Nicola Lanata\*, Yongxin Yao\*, Xiaoyu Deng, Vladimir Dobrosavljevic, and Gabriel Kotliar, *PRL* **118**, 126401 (2017)

# Multiplet structure in *f*-block chromates

$w_i$	0.88	0.06	0.04	0.002	$CsAm(CrO_4)_2$
$N_i$	6	7	5	6	
$J_i$	0	3.5	2.5	6	
$w_i$	0.921	0.069	0.007	0.004	$CsEu(CrO_4)_2$
$N_i$	6	7	5	6	
$J_i$	0	3.5	2.5	6	
$w_i$	0.93	0.017	0.015	0.012	$CsSm(CrO_4)_2$
$N_i$	5	6	6	6	
$J_i$	2.5	2	6	3	



62	${}^7F_0$	63	${}^8S_{7/2}^{\circ}$
<b>Sm</b>		<b>Eu</b>	
Samarium		Europium	
150.36		151.964	
$[Xe]4f^6 6s^2$		$[Xe]4f^7 6s^2$	
5.6437		5.6704	
94	${}^7F_0$	95	${}^8S_{7/2}^{\circ}$
<b>Pu</b>		<b>Am</b>	
Plutonium		Americium	
(244)		(243)	
$[Rn]5f^6 7s^2$		$[Rn]5f^7 7s^2$	
6.0260		5.9738	

- Dominant multiplet state correlates with valence.
- Smaller dominant multiplet weight in Am-compound implies relatively stronger *f*-covalency.

Shane S. Galley, Alexandra A. Arico, Tsung-Han Lee, Xiaoyu Deng, Yong-Xin Yao, Joseph M. Sperling, Vanessa Proust, Julia S. Storbeck, Vladimir Dobrosavljevic, Jennifer N. Neu, Theo Siegrist, Ryan E. Baumbach, Thomas E. Albrecht-Schmitt, Nikolas Kaltsoyannis, and Nicola Lanatà, *J. Am. Chem. Soc.* **140**, 1674-1685 (2018).

# Quantifying *f*-covalency

- Unique feature of handling multiple solutions on equal footing, including multiple (orbital-selective) Mott phases in Gutzwiller ansatz, allowing quantitative unbiased estimation of *f*-electron contribution to covalent bonding.
- Define the *f*-covalent bonding energy

$$\Delta E_{cov} \equiv E_{gs} - E_{Full}^{Mott}$$

Note for full Mott phase:  $|\Psi\rangle = |\Psi_f\rangle \otimes |\Psi_{env}\rangle$

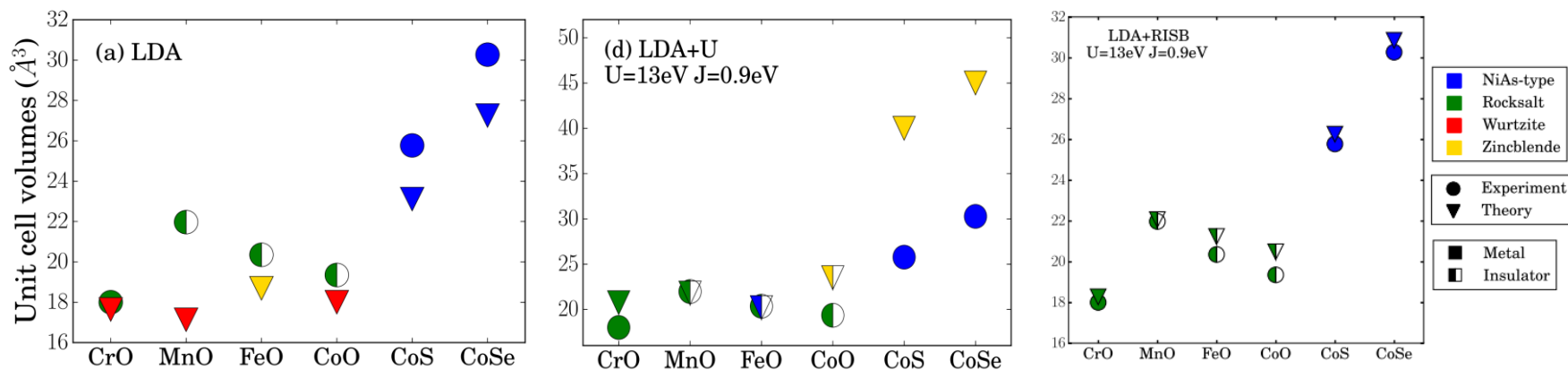
	<i>CsAm(CrO<sub>4</sub>)<sub>2</sub></i>	<i>CsEu(CrO<sub>4</sub>)<sub>2</sub></i>	<i>CsSm(CrO<sub>4</sub>)<sub>2</sub></i>
$\Delta E_{cov}$ (eV/f.u.)	1.85	0.76	0.67

- *5f*-electron covalency contributions to chemical bonds are non-negligible.
- Covalency effects are more important in  $\alpha$ -*CsAm(CrO<sub>4</sub>)<sub>2</sub>* than others.

Shane S. Galley, Alexandra A. Arico, Tsung-Han Lee, Xiaoyu Deng, Yong-Xin Yao, Joseph M. Sperling, Vanessa Proust, Julia S. Storbeck, Vladimir Dobrosavljevic, Jennifer N. Neu, Theo Siegrist, Ryan E. Baumbach, Thomas E. Albrecht-Schmitt, Nikolas Kaltsoyannis, and Nicola Lanatà, *J. Am. Chem. Soc.* **140**, 1674-1685 (2018).



# Ground state structure and electronic phases



LDA fails to predict

- ground state structure (rocksalt) of oxides
- insulating state.

- LSDA+U (or GGA+U) generally improves LDA
- Will still predict wrong crystal structures.

DFT+G calculations yield overall good description of ground state structure, electronic states and equilibrium volume.

N. Lanatà, T.-H. Lee, Y.-X. Yao, V. Stevanović, and V. Dobrosavljević, *Npj Computational Materials* **5**, 30 (2019).

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# Generic Hubbard Model and Gutzwiller Ansatz

$$\hat{H} = \sum_{\mathbf{k}} \sum_{ij} \sum_{\alpha\beta\sigma} \epsilon_{\mathbf{k}i\alpha j\beta} \hat{c}_{\mathbf{k}i\alpha\sigma}^\dagger \hat{c}_{\mathbf{k}j\beta\sigma} + \sum_{\mathbf{R}} \sum_{i\alpha \in corr} \hat{H}_i^{loc} \left[ \left\{ \hat{c}_{\mathbf{R}i\alpha\sigma}^\dagger \right\}, \left\{ \hat{c}_{\mathbf{R}i\alpha\sigma} \right\} \right]$$

Gutzwiller wave function

$$|\Psi_G\rangle \equiv \mathcal{P} |\Psi_0\rangle = \prod_{\mathbf{R}, i \in corr} \mathcal{P}_{\mathbf{R}i} |\Psi_0\rangle$$

Gutzwiller correlator

$$\mathcal{P}_{\mathbf{R}i} = \sum_{\Gamma\Gamma'} \Lambda_{i\Gamma\Gamma'} |\Gamma_{\mathbf{R}i}\rangle \langle \Gamma'_{\mathbf{R}i}|$$

$$|\Gamma_{\mathbf{R}i}\rangle = \left( c_{\mathbf{R}i1}^\dagger \right)^{n_1(\Gamma_{\mathbf{R}i})} \cdots \left( c_{\mathbf{R}iM}^\dagger \right)^{n_M(\Gamma_{\mathbf{R}i})} |0\rangle$$

# Expectation values

Renormalized nonlocal one-particle density matrix:

$$\langle \Psi_G | \hat{c}_{i\alpha}^\dagger \hat{c}_{j\beta} | \Psi_G \rangle = \mathcal{R}_{a\alpha}^\dagger \mathcal{R}_{\beta b} \langle \Psi_0 | \hat{f}_{ia}^\dagger \hat{f}_{jb} | \Psi_0 \rangle$$

Renormalized local reduced many-body density matrix:

$$\varrho^G \equiv \phi \phi^\dagger = \Lambda \varrho^0 \Lambda^\dagger$$

$$\varrho_{\Gamma\Gamma'}^0 \equiv \langle \Psi_0 | \Gamma \rangle \langle \Gamma' | \Psi_0 \rangle$$

$$\phi = \Lambda \sqrt{\varrho^0}$$

Expectation value of any local operator

$$\langle \Psi_G | \hat{O}_l | \Psi_G \rangle = \text{Tr} [\phi \phi^\dagger O_l]$$

# Gutzwiller nonlinear equations

$$\mathcal{R}, \lambda \rightarrow \frac{1}{\mathcal{N}} \sum_{\mathbf{k}} \text{Tr} [f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu)] = \lambda$$

$$\frac{1}{\mathcal{N}} \left[ \sum_{\mathbf{k}} \Pi_i f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu) \right]$$

$$1 - \sum_{\mathbf{k}} \Pi_i f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu) = 0$$

$$\hat{H}_i^{emb}[\mathcal{D}_i; \lambda_i^c] |\Phi_i\rangle = E_i^c |\Phi_i\rangle$$

$$\langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle - [\Delta_{pi}]_{ab} = \begin{bmatrix} \mathcal{F}_i^{(1)} \\ \mathcal{F}_i^{(2)} \end{bmatrix} \Rightarrow 0$$

**MINPACK-HYBRD: a modification of the Powell hybrid method. Use a combination of the **Newton (Jacobian)** and scaled gradient directions (Broyden).**

Done

# Gutzwiller Embedding Hamiltonian

$$\hat{H}^{emb} [\mathcal{D}; \lambda^c] \equiv \hat{H}^{loc} [\{\hat{c}_\alpha^\dagger\}, \{\hat{c}_\alpha\}] + \sum_{a\alpha} (\mathcal{D}_{a\alpha} \hat{c}_\alpha^\dagger f_a + H.c.) + \sum_{ab} \lambda_{ab}^c \hat{f}_b \hat{f}_a^\dagger$$

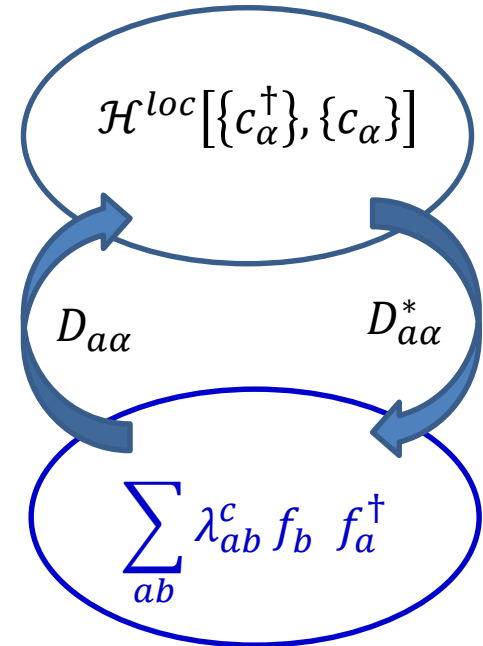
- The number of bath orbitals is exactly equal to the number of impurity orbitals.
- Solve the grounds state of the model at “half-filling”:
  - 1) Exact diagonalization  $\rightarrow |\Phi\rangle$
  - 2) DMRG, ...,  $\rightarrow |\Phi\rangle$

However, what we need is some reduced

information of  $|\Phi\rangle$ :  $\vec{f}(\{D, \lambda\}) = DM$

3) Machine learning

Quadratic + quartic terms



# ML mapping function and derivative

Represent local single particle matrices in the symmetry-adapted orthonormal Hermitian matrix basis

$$\{h_{is} : [g_{in}, h_{is}] = 0 \forall g \in G_i\}$$

$$\Delta_{pi} = \sum_s d_{is}^p {}^t h_{is}$$

$$\lambda_i = \sum_s l_{is} h_{is}$$

$$\lambda_i^c = \sum_s l_{is}^c h_{is}$$

$$\mathcal{R}_i = \sum_s r_{is} h_{is}$$

$$\mathcal{D}_i = \sum_s d_{is} h_{is}$$

The ML mapping function

$$\left\{ \langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ia} | \Phi_i \rangle, \langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle \right\} = f(\{l_{is}^c, d_{is}\})$$

The analytical derivatives

$$\frac{\partial f[\langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ia} | \Phi_i \rangle]}{\partial l_{is'}^c}, \frac{\partial f[\langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ia} | \Phi_i \rangle]}{\partial d_{is'}}$$

$$\frac{\partial f[\langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle]}{\partial l_{is'}^c}, \frac{\partial f[\langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle]}{\partial d_{is'}}$$

$$\text{KRG: } f[\mathbf{x}] = \sum_i y_i e^{-\gamma \sum_j |x_j - s_j^{(i)}| + 0^+}$$

# Nitty-Gritties: full Jacobian matrix

$$\frac{1}{\mathcal{N}} \sum_{\mathbf{k}} \text{Tr} [f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu)] = N_e$$

$$\frac{1}{\mathcal{N}} \left[ \sum_{\mathbf{k}} \Pi_i f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu) \Pi_i \right]_{ba} = [\Delta_{pi}]_{ab}$$

$$\frac{1}{\mathcal{N}} \sum_c [\Delta_{pi}(1 - \Delta_{pi})]_{ac}^{-\frac{1}{2}} \left[ \frac{1}{R_i} \sum_{\mathbf{k}} \Pi_i f(\mathcal{R}\epsilon_{\mathbf{k}}\mathcal{R}^\dagger + \lambda - \mu) \Pi_i \right]_{ca} = [\mathcal{D}_i]_{a\alpha}$$

$$-\sum_{cb\alpha} \frac{\partial}{\partial d_{is}^c} [\Delta_{pi}(1 - \Delta_{pi})]_{cb}^{\frac{1}{2}} [\mathcal{D}_i]_{b\alpha} [\mathcal{R}_i]_{c\alpha} - c.c. - l_{is} = l_{is}^c$$

$$\hat{H}_i^{emc} [\mathcal{D}_i; \lambda_i^c] |\Phi_i\rangle - E_i^c |\Phi_i\rangle = 0$$

$$\sum_c [\Delta_{pi}(1 - \Delta_{pi})]_{ca}^{-\frac{1}{2}} \langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ic} | \Phi_i \rangle - [\mathcal{R}_i]_{a\alpha} = [\mathcal{F}_i^{(1)}]_{a\alpha} \Rightarrow 0$$

$$\langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle - [\Delta_{pi}]_{ab} = [\mathcal{F}_i^{(2)}]_{ab} \Rightarrow 0$$

Second order derivatives of a matrix function?



Nicola Lanata'

$$\frac{\partial [\mathcal{F}_i^{(1)}]_{a\alpha}}{\partial r(l)_{i's'}} = \sum_c \left( \frac{\partial ([\Delta_{pi}(1 - \Delta_{pi})]_{ca}^{-\frac{1}{2}})}{\partial r(l)_{i's'}} \langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ic} | \Phi_i \rangle + [\Delta_{pi}(1 - \Delta_{pi})]_{ca}^{-\frac{1}{2}} \left( \frac{\partial \langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ic} | \Phi_i \rangle}{\partial l_{is'}^c} \frac{\partial l_{is''}^c}{\partial r(l)_{i's'}} + \frac{\partial \langle \Phi_i | \hat{c}_{i\alpha}^\dagger \hat{f}_{ic} | \Phi_i \rangle}{\partial d_{is''}} \frac{\partial d_{is''}}{\partial r(l)_{i's'}} \right) \right) - \frac{\partial r_{is}}{\partial r(l)_{i's'}}$$

$$\frac{\partial [\mathcal{F}_i^{(2)}]_{ab}}{\partial r(l)_{i's'}} = \sum_c \left( \frac{\partial \langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle}{\partial l_{is''}^c} \frac{\partial l_{is''}^c}{\partial r(l)_{i's'}} + \frac{\partial \langle \Phi_i | \hat{f}_{ib} \hat{f}_{ia}^\dagger | \Phi_i \rangle}{\partial d_{is''}} \frac{\partial d_{is''}}{\partial r(l)_{i's'}} \right) - \frac{\partial [\Delta_{pi}]_{ab}}{\partial r(l)_{i's'}}$$



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# Analytical Jacobian for large system simulation

$$\mathbf{J} = \left[ \begin{array}{ccc} \frac{\partial \mathbf{f}}{\partial x_1} & \cdots & \frac{\partial \mathbf{f}}{\partial x_n} \end{array} \right] = \left[ \begin{array}{ccc} \frac{\partial f_1}{\partial x_1} & \cdots & \frac{\partial f_1}{\partial x_n} \\ \vdots & \ddots & \vdots \\ \frac{\partial f_m}{\partial x_1} & \cdots & \frac{\partial f_m}{\partial x_n} \end{array} \right]$$

Numerical Jacobian evaluation requires number of function evaluations proportional to dimension of the solution vector, which soon becomes dominant in systems of large size or low symmetry!

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# Implementation: OOP

```
type,public::bandstru_ob
  !< iso=2 => soc
  integer ispin_in,nspin_in,
  integer n_mott,mode_hk ! mo
  !< ne(3). 1: total number o
  real(q),pointer :: ek(:,:,)
  real(q),allocatable :: norm
  complex(q),pointer :: r(:,:,)
  &d0(:,:,,:),nrl(:,:,)
  complex(q),pointer :: psi0
  complex(q),pointer :: vk (
  complex(q),allocatable :: k
  complex(q),allocatable :: l
  type (sym_info) :: sym
  type (k_points) :: kpt

contains
  procedure::init=>set_bnd_in
  procedure::read_hk0=>read_k
  procedure::rotate_hk0=>rota
  procedure::corr_ebwidth=>ca
  procedure::calc_all=>calc_k
  procedure::rm_hle_from_hk0=
  procedure::calc_fermi=>gut
```

```
type,extends(bandstru_ob),public::bandsder_ob
  real(q),pointer :: fw_der(:,:,)
  real(q) :: sum_fw_der=0
  real(q),allocatable :: pmupr(:) ! dmu/dr e
  real(q),allocatable :: pmupl(:) ! dmu/dlan
contains
  procedure::calc_derivatives
end type

contains
  subroutine calc_derivatives(this,loc,mpi,io)
  class(bandsder_ob) :: this
  class(localstder_ob) :: loc
  class(mpi_ob) :: mpi
  integer,intent(in)::io

  call loc%init_der()
  call set_mu_delta(this%ef,this%kpt%delta)
  call set_fermi_wt_derivative(this,mpi,io)
  call set_pmupl(this,loc,mpi)
  call set_pmupr(this,loc,mpi)
  call set_pdm(this,loc,mpi)
  call loc%calc_pdm_pp(io)
  call loc%calc_pdplr()
  call loc%calc_plcplr()
  call loc%calc_pdlc_pp(io)
```

# Benchmark

0 maxerr = 1.131318  
1 maxerr = 1.131318  
2 maxerr = 1.131318  
3 maxerr = 1.131318  
4 maxerr = 1.131319  
5 maxerr = 1.131350  
6 maxerr = 1.131334  
7 maxerr = 1.131251  
8 maxerr = 0.253372  
9 maxerr = 0.021059  
10 maxerr = 0.035637  
11 maxerr = 0.045146  
12 maxerr = 0.021059  
13 maxerr = 0.021060  
14 maxerr = 0.021071  
15 maxerr = 0.021043  
16 maxerr = 0.015036  
17 maxerr = 0.017871  
18 maxerr = 0.005150  
19 maxerr = 0.000539  
20 maxerr = 1.39e-05  
21 maxerr = 2.28e-06

1 maxerr = 1.13131  
2 maxerr = 1.13131  
3 maxerr = 1.13131  
4 maxerr = 1.13131  
5 maxerr = 1.13131  
6 maxerr = 0.28457  
7 maxerr = 0.17625  
8 maxerr = 0.04030  
9 maxerr = 0.02578  
10 maxerr = 0.01943  
11 maxerr = 0.01356  
12 maxerr = 0.00220  
13 maxerr = 0.00166  
14 maxerr = 0.00095  
15 maxerr = 9.5e-05  
16 maxerr = 1.7e-05  
17 maxerr = 4.1e-06

0 maxerr = 1.02568  
1 maxerr = 1.02568  
2 maxerr = 1.02568  
3 maxerr = 1.02568  
4 maxerr = 1.02568  
5 maxerr = 1.02571  
6 maxerr = 1.02568  
7 maxerr = 1.02571  
8 maxerr = 1.02597  
9 maxerr = 1.02570  
10 maxerr = 1.02597  
11 maxerr = 1.02570  
12 maxerr = 0.30190  
13 maxerr = 0.01960  
14 maxerr = 0.03630  
15 maxerr = 0.05215  
16 maxerr = 0.01960  
17 maxerr = 0.01961  
18 maxerr = 0.01960  
19 maxerr = 0.01961  
20 maxerr = 0.01964  
21 maxerr = 0.01961  
22 maxerr = 0.01964  
23 maxerr = 0.01961  
24 maxerr = 0.01345  
25 maxerr = 0.01372  
26 maxerr = 0.00214  
27 maxerr = 0.00015  
28 maxerr = 9.4e-06  
29 maxerr = 7.7e-07

0 maxerr = 1.02625  
1 maxerr = 1.02625  
2 maxerr = 1.02625  
3 maxerr = 1.02625  
4 maxerr = 1.02625  
5 maxerr = 1.02625  
6 maxerr = 0.58126  
7 maxerr = 0.39147  
8 maxerr = 0.15406  
9 maxerr = 0.08180  
10 maxerr = 0.06056  
11 maxerr = 0.01275  
12 maxerr = 0.00481  
13 maxerr = 0.00049  
14 maxerr = 0.00037  
15 maxerr = 0.00152  
16 maxerr = 4.5e-07

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Questions, comments criticisms to

[yxphysics@gmail.com](mailto:yxphysics@gmail.com)

# National Quantum Initiative Act



## An Act

To provide for a coordinated Federal program to accelerate quantum research and development for the economic and national security of the United States.

*Be it enacted by the Senate and House of Representatives of the United States of America in Congress assembled,*

### **SECTION 1. SHORT TITLE; TABLE OF CONTENTS.**

(a) **SHORT TITLE.**—This Act may be cited as the “National Quantum Initiative Act”.

### **TITLE IV—DEPARTMENT OF ENERGY QUANTUM ACTIVITIES**

Sec. 401. Quantum Information Science Research program.

Sec. 402. National Quantum Information Science Research Centers.



# Opportunities for Quantum Computing in Chemical and Materials Sciences

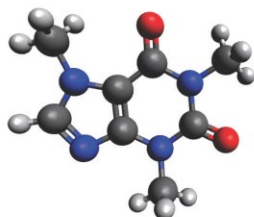
## Priority Research Opportunities .....

PRO 1: Controlling the Quantum Dynamics of Nonequilibrium Chemical and Materials Systems .....

PRO 2: Unraveling the Physics and Chemistry of Strongly Correlated Electron Systems .....

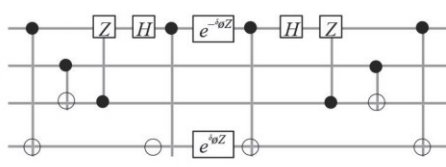
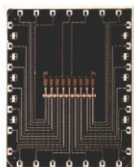
PRO 3: Embedding Quantum Hardware in Classical Frameworks .....

### TYPICAL CHEMISTRY PROBLEM WORKFLOW



$$H = \sum_{ij} h_{ij} a_i^\dagger a_j + \frac{1}{2} \sum_{ijkl} h_{ijkl} a_i^\dagger a_j^\dagger a_k a_l$$

$$H = \sum_{i\alpha} g_i^\alpha \sigma_\alpha^i + \sum_{i\alpha j\beta} g_{ij}^{\alpha\beta} \sigma_\alpha^i \sigma_\beta^j + \dots$$



1. Molecule Specification:
  - XYZ Coordinates
  - Spin Number of electrons
  - Discretization (Basis set / grid)
2. Integral Generation
  - Depends on basis set, often uses external software
3. Starter Calculation (e.g., Hartree-Fock)
  - Integral basis change
  - Initial state preparation
4. Map to Qubits
  - Jordan-Wigner
  - Bravyi-Kitaev
  - ...
5. Select Problem and Algorithm
  - Energies, properties, etc.
  - Quantum phase estimation
  - Variational quantum eigensolver (and ansatz)
6. Map to Hardware





# Hybrid Quantum-Classical Approach

PHYSICAL REVIEW X **6**, 031045 (2016)

## Hybrid Quantum-Classical Approach to Correlated Materials

Bela Bauer,<sup>1</sup> Dave Wecker,<sup>2</sup> Andrew J. Millis,<sup>3</sup> Matthew B. Hastings,<sup>1,2</sup> and Matthias Troyer<sup>4,2</sup>

<sup>1</sup>*Station Q, Microsoft Research, Santa Barbara, California 93106-6105, USA*

<sup>2</sup>*Quantum Architectures and Computation Group, Microsoft Research, Redmond, Washington 98052, USA*

<sup>3</sup>*Department of Physics, Columbia University in the City of New York, New York, New York 10027, USA*

<sup>4</sup>*Theoretische Physik and Station Q Zurich, ETH Zurich, 8093 Zurich, Switzerland*

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Solve discretized AIM:

$$H = H_{\text{imp}} + H_{\text{bath}} + H_{\text{mix}},$$

$$H_{\text{imp}} = \sum_{\alpha\beta} t_{\alpha\beta} c_{\alpha}^{\dagger} c_{\beta} + \sum_{\alpha\beta\gamma\delta} U_{\alpha\beta\gamma\delta} c_{\alpha}^{\dagger} c_{\beta}^{\dagger} c_{\gamma} c_{\delta},$$

$$H_{\text{mix}} = \sum_{ai} (V_{ai} c_{\alpha}^{\dagger} d_i + \bar{V}_{ai} d_i^{\dagger} c_{\alpha}),$$

$$H_{\text{bath}} = \sum_i \epsilon_i d_i^{\dagger} d_i,$$

- Adiabatic state preparation
- Quantum phase estimation (QPE)
- Measure real time GF

For  $N_{S0} = 2-20$  @0 K:

- Measurements:  $10^6 \sim 10^8$
- Deep circuits:  $10^6 \sim 10^8$  gates

# Noisy Intermediate Quantum Computing

## Quantum Computing in the NISQ era and beyond

John Preskill

Institute for Quantum Information and Matter and Walter Burke Institute for Theoretical Physics,  
California Institute of Technology, Pasadena CA 91125, USA

30 July 2018

- 50 to a few hundred qubits
- Error rate per two-qubit gate: 0.1% or worse
- Measurement error: 1% or worse
- Circuit to run  $< 1000$  two-qubit gates

# Variational Quantum Eigen Solver

an unsung hero of approximate quantum computing

ARTICLE

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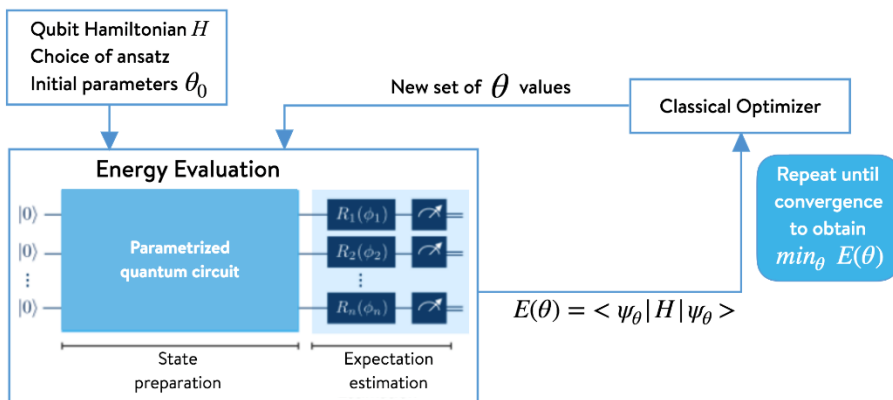
## A variational eigenvalue solver on a photonic quantum processor

Alberto Peruzzo<sup>1,\*</sup>, Jarrod McClean<sup>2,\*</sup>, Peter Shadbolt<sup>1</sup>, Man-Hong Yung<sup>2,3</sup>, Xiao-Qi Zhou<sup>1</sup>, Peter J. Love<sup>4</sup>, Alán Aspuru-Guzik<sup>2</sup> & Jeremy L. O'Brien<sup>1</sup>

### Accelerated Variational Quantum Eigensolver

Daochen Wang,<sup>\*</sup> Oscar Higgott, and Stephen Brierley  
Riverlane, 3 Charles Babbage Road, Cambridge CB3 0GT, United Kingdom

(Received 18 June 2018; revised manuscript received 18 December 2018; published 12 April 2019)



## The theory of variational hybrid quantum-classical algorithms

Jarrod R McClean<sup>1</sup>, Jonathan Romero<sup>1</sup>, Ryan Babbush<sup>1</sup> and Alán Aspuru-Guzik<sup>2</sup>

<sup>1</sup> Computational Research Division, Lawrence Berkeley National Laboratory, Berkeley, CA 94720, USA

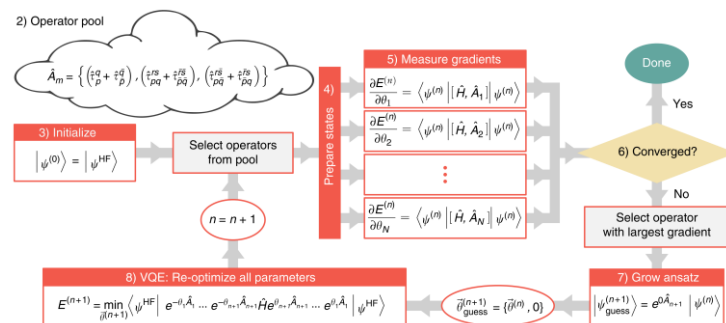
<sup>2</sup> Department of Chemistry and Chemical Biology, Harvard University, Cambridge, MA 02138, USA

<sup>3</sup> Google, Venice, CA 90291, USA

E-mail: jmclean@lbl.gov and aspuru@chemistry.harvard.edu

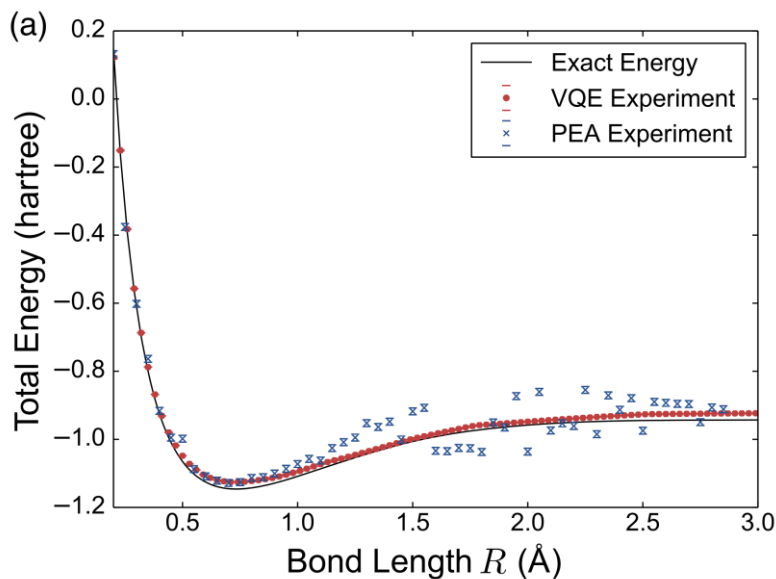
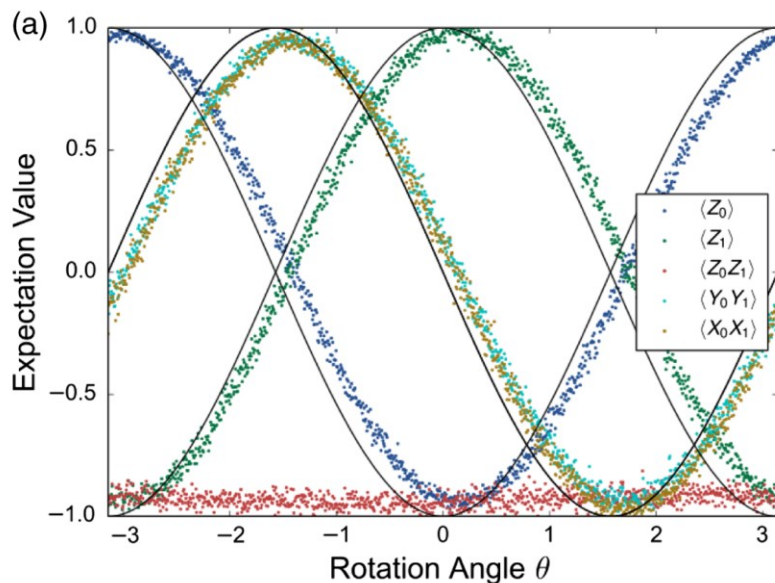
## An adaptive variational algorithm for exact molecular simulations on a quantum computer

Harper R. Grimsley<sup>1</sup>, Sophia E. Economou<sup>2</sup>, Edwin Barnes<sup>2</sup> & Nicholas J. Mayhall<sup>1</sup>



Trade deep circuits with few measurements in QPE for short circuits with more measurements in VQE for error mitigation.

# Noise tolerance



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## Scalable Quantum Simulation of Molecular Energies

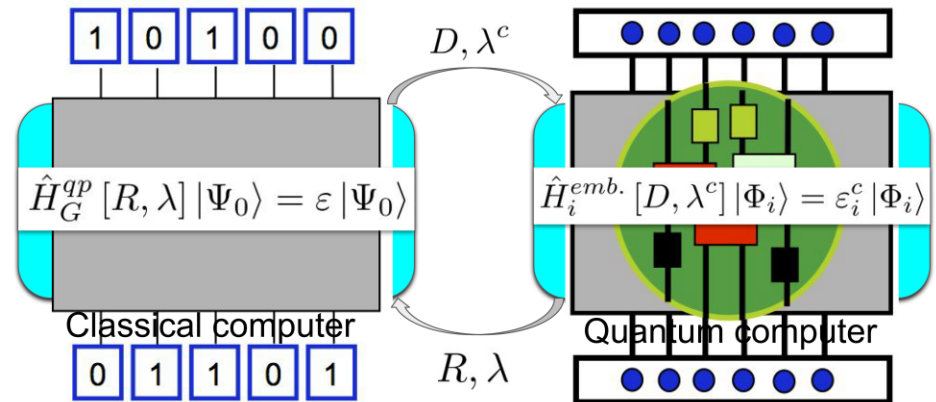
P. J. J. O'Malley,<sup>1,\*</sup> R. Babbush,<sup>2,†</sup> I. D. Kivlichan,<sup>3</sup> J. Romero,<sup>3</sup> J. R. McClean,<sup>4</sup> R. Barends,<sup>5</sup> J. Kelly,<sup>5</sup> P. Roushan,<sup>5</sup> A. Tranter,<sup>6,7</sup> N. Ding,<sup>2</sup> B. Campbell,<sup>1</sup> Y. Chen,<sup>5</sup> Z. Chen,<sup>1</sup> B. Chiaro,<sup>1</sup> A. Dunsworth,<sup>1</sup> A. G. Fowler,<sup>5</sup> E. Jeffrey,<sup>5</sup> E. Lucero,<sup>5</sup> A. Megrant,<sup>5</sup> J. Y. Mutus,<sup>5</sup> M. Neeley,<sup>5</sup> C. Neill,<sup>1</sup> C. Quintana,<sup>1</sup> D. Sank,<sup>5</sup> A. Vainsencher,<sup>1</sup> J. Wenner,<sup>1</sup> T. C. White,<sup>5</sup> P. V. Coveney,<sup>7</sup> P. J. Love,<sup>6</sup> H. Neven,<sup>2</sup> A. Aspuru-Guzik,<sup>3</sup> and J. M. Martinis<sup>5,1,‡</sup>

# Gutzwiller Embedding Hamiltonian

$$\hat{H}^{emb} [D; \lambda^c] \equiv \hat{H}^{loc} [\{\hat{c}_\alpha^\dagger\}, \{\hat{c}_\alpha\}] + \sum_{a\alpha} (D_{a\alpha} \hat{c}_\alpha^\dagger f_a + H.c.) + \sum_{ab} \lambda_{ab}^c \hat{f}_b \hat{f}_a^\dagger$$

- The number of bath orbitals is exactly equal to the number of impurity orbitals.
- “Dimer” with much sparse Hamiltonian
- Various variational quantum eigen-solver to find the ground state and measure the one-particle density matrix.

$$\hat{H} = \sum_{\mathbf{k}, i\alpha, j\beta} \epsilon_{i\alpha j\beta}^{\mathbf{k}} \hat{c}_{\mathbf{k}i\alpha}^\dagger \hat{c}_{\mathbf{k}j\beta} + \sum_{\mathbf{R}i} \hat{H}_i^{loc} [\{\hat{c}_{\mathbf{R}i\alpha}^\dagger\}, \{\hat{c}_{\mathbf{R}i\alpha}\}]$$



Thank  
you!



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