High-performance and Quantum Computing for Strongly Correlated Problems

DRESDEN concept Werner Dobrautz CASUS Institute Talk Sca SYSTEMS LINDEDSTANDING DRESDEN I EIPZIG January 15, 2025 Bundesministerium für Bildung **Ovantum** quanten Future und Forschung technologien INSTITUTE OF PARTICIPATING INSTITUTIONS FUNDED BY TECHNISCH Federal Ministra Uniwersytet of Education NEL MUOLTZ MAX PLANCK INSTITUTE UNIVERSITA Steaeamittein auf Grundiage des vom Sächsische and Research Contro for Endroamontal Resear HELMHEDTZ ZERTERIM

Background and Motivation

- High-performance Computing for Strong Correlation

Quantum Computing for Strong Correlation

Summary and Outlook

Background and Motivation

Scientific Background and Research Profile



Scientific Background and Research Profile



- Quantum Monte Carlo methods for strongly correlated problems
- Resource reduction and embedding
- Study of transition metal clusters

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- Quantum Monte Carlo methods for strongly correlated problems
- Resource reduction and embedding
- Study of transition metal clusters

- Algorithm development:
 Quantum imaginary time evolution
- Error mitigation and classical optimization
- Resource reduction: Qubits and circuit depth

Motivation: Haber-Bosch process and biological nitrogen fixation

Haber-Bosch Process



- Crucial for fertilizer production
- 2% of world's energy consumption
- 3% of global carbon emissions
- 5% of natural gas consumption

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Biological nitrogen fixation



- Ambient pressure and temperature
- Not yet understood \rightarrow Bio-catalysts for more efficient and greener ammonia production

- Transition metal clusters act as catalysts: Iron-Molybdenum cofactor (FeMoCo) and other iron-sulfur clusters
- Experimental study very difficult!



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- \to Numerical studies of relevant quantum phenomena necessary $\to \hat{\mathbf{H}} \ket{\Psi} = \mathbf{E} \ket{\Psi}$

We have the equations at hand, but exponentially costly on classical computers!





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Use a combined AI, HPC and QC approach for a potential computational speedup





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Iron molybdenum cofactor (FeMoCo): nitrogen fixation of nitrogenase Manganese Calcium Oxygen Clusters: Oxygen evolving clusters in photosystem II







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To obtain insight on the **chemical** and **physical properties** of these systems we need to **solve the Schrödinger equation**

$$\hat{H} |\Psi\rangle = E |\Psi\rangle, \qquad \qquad \hat{H} |\Psi(t)\rangle = i \frac{\partial}{\partial t} |\Psi(t)\rangle$$

All necessary information contained in electronic molecular Hamiltonian

$$\hat{H} = \underbrace{-\frac{1}{2} \sum_{i} \nabla_{\mathbf{r}_{i}}^{2}}_{\text{kinetic energy of } \mathbf{e}^{-}} - \underbrace{\sum_{I,j} \frac{Z_{I}}{|\mathbf{R}_{I} - \mathbf{r}_{j}|}}_{\text{Attr. potential}} + \underbrace{\frac{1}{2} \sum_{i \neq j} \frac{1}{|\mathbf{r}_{i} - \mathbf{r}_{j}|}}_{\mathbf{e}^{-} - \mathbf{e}^{-} \text{ repulsion}} \xrightarrow{\mathbf{r}_{ij}} \underbrace{\mathbf{R}_{Ij}}_{\mathbf{r}_{ij}} \underbrace{\mathbf{A}}_{\mathbf{r}_{ij}}$$

 $\label{eq:coulomb} \begin{array}{l} \mbox{Coulomb repulsion correlates all electrons of a system} \to \mbox{analytic solution too} \\ \mbox{complex} \to \mbox{approximations and computational approaches} \end{array}$









(FCIQMC) code NECI: \approx 30 developers, highly optimized for HPC



PRL 121, 056401 (2018); JCP 153, 034107 (2020); JCTC 19, 20, 6933 (2023)



- Main developer of full configuration interaction quantum Monte Carlo (FCIQMC) code NECI: \approx 30 developers, highly optimized for HPC
- **Embedding** in form of complete active space self-consistent field:
 - \rightarrow Interfaced FCIQMC as active space solver with <code>OpenMolcas</code>



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Exponential scaling of Full Configuration Interaction

 $\mathsf{FCI} \Rightarrow \mathsf{exact}$ solution in a given basis: linear combination of determinants



 $|\Phi_{HF}\rangle + c_i^a |\Phi_i^a\rangle + c_{ij}^{ab} |\Phi_{ij}^{ab}\rangle + c_{ijk}^{abc} |\Phi_{ijk}^{abc}\rangle$ All possible excitations from HF determinant

Exponential scaling of Full Configuration Interaction

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$$\hat{H} |\Psi\rangle = E |\Psi\rangle \qquad \Rightarrow \qquad |\Psi\rangle = |\Phi_{HF}\rangle + \sum_{i} c_{i} |\Phi_{i}\rangle$$



Number of states for given number of electrons and orbitals, active space (n_e, n_o)

Mol.	#orbitals	#electrons	#states
H_2	2	2	4
LiH	4	4	36
Be_2	8	8	4900
H_2O	12	12	$\sim 8\cdot 10^5$
C_2H_4	16	16	$\sim 16\cdot 10^6$
F_2	18	18	$\sim 2\cdot 10^9$

High-performance Computing for Strong Correlation

Imaginary Time Evolution

Imaginary-time evolution \rightarrow method to project onto groundstate:

$$i\frac{\partial\left|\Psi\right\rangle}{\partial t} = \hat{H}\left|\Psi\right\rangle \quad \stackrel{\tau=it}{\rightarrow} \quad \frac{\partial\left|\Psi\right\rangle}{\partial \tau} = -\hat{H}\left|\Psi\right\rangle \quad \rightarrow \quad \left|\Psi_{0}\right\rangle = \lim_{\tau \to \infty} \mathrm{e}^{-\hat{H}\tau}\left|\Phi(0)\right\rangle$$



Full Configuration Interaction Quantum Monte Carlo – FCIQMC

• Based on the imaginary-time Schrödinger Eq.

$$\hat{H} |\Psi(\tau)\rangle = -\frac{\partial |\Psi(\tau)\rangle}{\partial \tau} \rightarrow \boxed{|\Psi_0\rangle = \lim_{\tau \to \infty} e^{-\hat{H}\tau} |\Phi(0)\rangle}$$

- Wavefunction, $|\Psi_0\rangle,$ is stochastically sampled by a set of "walkers"



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Highly-optimized for HPC. Excited state energies and properties for large active spaces > (50e, 50o)

My major contributions:

Implementation of spin symmetry and transcorrelation.

Booth, Thom, and Alavi, JCP, 131, 054106 (2009); Guther, ..., WD, ..., Alavi, JCP, 153, 034107 (2020); *https://github.com/ghb24/NECI_STABLE

Massively Parallel – Towards the Exascale









MAX PLANCK COMPUTING & DATA FACILITY

CAS(54e,54o) FeMoco molecule on 512 and 620 nodes @ Max-Planck Cobra HPC cluster

Walkers	Cores	Time/iteration	Ratio cores	Ratio time/iteration	Parallel efficiency (%)
$\begin{array}{c} 32\times10^9\\ 32\times10^9\end{array}$	19960 24800	23.5 18.8	1.242	1.246	99.68

Ongoing work in the European Center of Excellence Targeting Real Chemical Accuracy at the EXascale (TREX) Interfaced with Molpro, OpenMolcas, PySCF and VASP William Jalby @



Guther, ..., WD, ..., Alavi, JCP, 153, 034107 (2020)

Spin Symmetry

Motivation: Potential Problems of a Slater determinant formulation





- No control and insight of total spin
- Narrow spin-gaps problematic

↑ ↑ ↓ ↑ ↓ 3d

Doublet ${}^{2}F \xrightarrow{4} 4s$ $\uparrow \uparrow \downarrow \uparrow \uparrow \downarrow \uparrow 3d$ Quartet ${}^{4}F \xrightarrow{4} 4s$

- Hard to obtain low-spin excited states
- Multi-reference open-shell low-spin excited state problematic for single-reference methods

\Rightarrow Use a spin-adapted basis

HPC Resource Reduction – Spin Symmetry

Symmetries reduce the computational cost, by block-diagonalizing the Hamiltonian



Spin symmetry: inherent to most electronic structure problems, often not used, due to *impractical implementation*.

Efficient implementation in FCIQMC based on the unitary group approach[‡]

⁺ WD, Smart and Alavi, JCP, 151, 094104 (2019); [‡]Paldus, J. Chem. Phys. 61, 5321 (1974) + Shavitt, Int. J. Quantum Chem., 12, 131 (1977)

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Benefits of a spin-symmetry adapted basis:

• Target specific spin-states

• Reduce Hilbert space/problem size

[†] WD, Smart and Alavi, JCP, 151, 094104 (2019); [‡]Paldus, J. Chem. Phys. 61, 5321 (1974) + Shavitt, Int. J. Quantum Chem., 12, 131 (1977)

Results: Iron-sulfur clusters – Fe_4S_4

Energy and magnetic properties of Fe_4S_4 clusters: Singlet spin states with 20 open shell orbitals.



Six lowest singlet states in (20e,20o) active space resolved within $\approx 3~\rm{mH}$

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Access to wavefunction and spin information \rightarrow reveals magnetic coupling of ground- and excited states

Li Manni, WD, Bogdanov, Guther, Alavi, JCP A 125 (22), 4727 (2021)
HPC Resource Reduction – Spin-symmetry and Embedding – Fe_2S_2

Combination of FCIQMC, spin-symmetry and embedding to study magnetic properties of iron-sulfur clusters



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JCP **151**, 094104 (2019); JCTC **16**, 4, 2202 (2020); JPC A **125**, 22, 4727 (2021); PRB **104**, 235102 (2021); PRB **105**, 195123 (2022); PRB **107**, 064405 (2023)

WD, Weser, Bogdanov, Alavi, Li Manni, JCTC 17 (9), 5684 (2021)

Results: Iron-sulfur clusters – Fe_2S_2



CASSCF: J' = 2.70 mH and K = 0.054 mH

Transcorrelation

Cusp condition: Singularity of Coulomb potential $(\sim \frac{1}{|\mathbf{r}_i - \mathbf{r}_j|})$ \rightarrow sharp cusp of exact wavefunction $\Psi({\mathbf{r}})$ at electron coalescence $(|\mathbf{r}_i - \mathbf{r}_j| = 0)$



HPC – Resource Reduction: Basis sets

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WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019).



WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019)



$$\hat{H} |\Psi\rangle = E |\Psi\rangle \quad \rightarrow \quad |\Psi\rangle = e^{\hat{J}} |\Phi\rangle \quad \rightarrow \quad \overbrace{e^{-\hat{J}} \hat{H} e^{\hat{J}}}^{\hat{H}_{\text{TC}}} |\Phi\rangle = E |\Phi\rangle$$

 $|\Phi\rangle$ easier to represent with less basis functions \rightarrow immense resource reduction

WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019)



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 \dot{H}_{TC} is non-Hermitian and has 3-body terms

WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019).

HPC – Resource Reduction: Transcorrelation – Results



WD, Cohen, Alavi, Giner, JCP 156 (23), 234108 (2022); Haupt, Hosseini, López Ríos, WD, Cohen, Alavi, JCP 158, 224105 (2023)

Quantum Computing for Strong Correlation

Classical bit

0 1

Quantum bit = qubit

$a \left| 0 \right\rangle + b \left| 1 \right\rangle$

Quantum bit = qubit



Qubits – **Bloch Sphere**



Qubits – Bloch Sphere





Qubits – Bloch Sphere



Bringing **two** qubits together:

$$|\Psi\rangle = \overbrace{(|0\rangle + |1\rangle)}^{\text{qubit 1}} \otimes \overbrace{(|0\rangle + |1\rangle)}^{\text{qubit 2}} = |00\rangle + |01\rangle + |10\rangle + |11\rangle \qquad \text{4 states}$$

Multiple Qubits – Entanglement

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 8 states

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N qubits can encode exponentially many (2^N) states. 40 qubits enough to encode the $\sim 2 \cdot 10^9$ states of F₂! \rightarrow Need new **quantum algorithms** to use this potential advantage!



How can Quantum Computing help Quantum Chemistry?



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- Map our problem (Hamiltonian/basis functions) onto quantum hardware/qubits
 - Qubits encode occupation of spin-orbitals $\in [0, 1]$

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- Map our problem (Hamiltonian/basis functions) onto quantum hardware/qubits
 - Qubits encode occupation of spin-orbitals $\in [0,1]$
- $\rightarrow\,$ Use quantum algorithms for ground-, excited states, dynamics, \ldots

1) Prepare an initial state $|\Phi_0\rangle$:

 $|\Phi_0\rangle = \begin{pmatrix} 1\\ 1\\ 0\\ 0 \end{pmatrix}$



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angle$:

 $|\Phi_0\rangle = \begin{pmatrix} 1\\1\\0\\0 \end{pmatrix}$

2) Perform unitary operations of chosen quantum algorithm:

$$|\Phi\rangle = \hat{U} |\Phi_0\rangle = a_1 \begin{pmatrix} 0\\0\\0\\0 \end{pmatrix} + a_2 \begin{pmatrix} 1\\0\\0\\0 \end{pmatrix} + \dots + a_{2^N} \begin{pmatrix} 1\\1\\1\\1 \end{pmatrix}$$

1) Prepare an initial state $|\Phi_0
angle$:

3) Measure observable $\langle \hat{O} \rangle$



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$$|\Phi_0\rangle = \begin{pmatrix} 1\\ 1\\ 0\\ 0 \end{pmatrix}$$

 $\sim 15 {
m mK}$ Magnetic shielding











Effect of noise:

- Bit flip: $|0\rangle \leftrightarrow |1\rangle$
- Phase flip: $|0\rangle \leftrightarrow |0\rangle$
- Decoherence: $|0\rangle + |1\rangle \rightarrow |0\rangle + e^{i?} |1\rangle$







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• . . .





Use many physical qubits to encode a logical qubit:

11111	$\rightarrow 1$	$11011 \rightarrow 1$	L

 $00000 \to 0 \qquad \qquad 01000 \to 0$



NISQ:

- Noisy and small quantum devices
- Limited utility
- Hybrid approaches

Fault-tolerant QC: Quantum advantage

- Shor's and Grover's algorithm
- Quantum phase estimation

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Continuous transition to fault-tolerant QC:

- Develop intuition on quantum algorithm development
- Transferability of developed algorithms to FT regime
- Feedback for experimentalists to improve devices
- Near-term utility and relevant applications
- No need for 'quantum for everything'

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Fault-tolerant QC: Quantum advantage

- Shor's algorithm
- Quantum phase estimation
Near-term approaches and our work

Use benefits of both quantum and classical resources



- Use short-depth quantum circuits that fit current hardware
- Improve on classical estimates by non-classical states
- Store quantum state with exponentially fewer resources

Use benefits of both quantum and classical resources



Use benefits of both quantum and classical resources



Use benefits of both quantum and classical resources



• Algorithms:

Quantum imaginary time evolution (QITE)

- Classical optimization
- Resource reduction:
 - Qubits and circuit depth
- Error mitigation

Quantum Computing – Algorithms and Classical Optimization

Orders of magnitude increased accuracy for quantum many-body problems on quantum computers via an exact transcorrelated method, *Phys. Rev. Research* **5**, 023174 (2023), I. O. Sokolov^{*}, **W. Dobrautz^{*}**, H. Luo, A. Alavi, I. Tavernelli



Quantum Computing – Algorithms and Classical Optimization

no-TC

30

- TC

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Cost Plateau Local Minima Classical Parameter value computer: --Ground state -ONG (block-diag) - aBang 1. Prep. system 1. Metric: - Adam - aBroyden - gBang (block-diag) 2. Solve for: $\mathbf{A}_{\mathrm{ij}} = \langle oldsymbol{\partial}_{ heta_{\mathrm{i}}} \mathbf{\Phi} | oldsymbol{\partial}_{ heta_{\mathrm{i}}} \mathbf{\Phi}
angle$ lavers: 4 $\dot{\theta} = -\mathbf{A}^{-1}\mathbf{C}$ (b) $|\psi(\theta)|H|\psi(\theta)\rangle$ L(0, 0,) $L(\theta_1, \Theta_2)$ \Rightarrow 0.10^{2} 10 Number of circuit evaluations

Optimizing Variational Quantum Algorithms with qBang: Efficiently Interweaving Metric and Momentum to Tackle Flat Energy Landscapes, D. Fitzek, R. S. Jonsson, W. Dobrautz, C Schäfer, Quantum 8, 1313 (2024)

Reference-State Error Mitigation: A Strategy for High Accuracy Quantum Computation of Chemistry, *J. Chem. Theory Comput.*, **19**, 3, 783 (2023) P. Lolur, M. Skogh, **W. Dobrautz**, C. Warren, J. Biznárová, A. Osman, G. Wendin, J. Bylander, M. Rahm



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Resource Reduction: Qubits and circuit depth



Resource Reduction: Qubits and circuit depth





Resource Reduction: Qubits and circuit depth



Quantum Computing – Resource Reduction – Transcorrelation



Smaller basis \rightarrow fewer qubits



Quantum Computing – Resource Reduction – Transcorrelation



Quantum Computing – Resource Reduction – Transcorrelation



Towards real chemical accuracy on current quantum hardware through the transcorrelated method, J. Chem. Theory Comput. 20, 10, 4146 (2024) W. Dobrautz, I. O. Sokolov, K. Liao, P. Lopez Rios, M. Rahm, A. Alavi, I. Tavernelli



Reducing quantum circuit depth for noise-resilient quantum chemistry, E. Magnusson, A. Fitzpatrick, S. Knecht, M. Rahm, W. Dobrautz, Faraday Discussions on *Correlated Electronic Structure* (2024)















Iron molybdenum cofactor (FeMoCo): nitrogen fixation of nitrogenase

Manganese Calcium Oxygen Clusters: Oxygen evolving clusters in photosystem II



Thank you for your attention!

HPC+QC toolkit to study strongly correlated quantum chemistry problems

Simulation of bio-chemical transition metal compounds relevant for the green energy transition

WP1

Resource reduction:

- Accurate calculations for relevant problems – Quantum imaginary time evolution
- Transcorrelation, active spaces, spin-symmetry and adaptive quantum Ansätze

Fewer gates

Fewer gubits



WP2 Algorithms and software for relevant insights: Electronic properties Quantum embedding Excited states • Efficient QC+HPC implementation



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WP1 Resource reduction: Accurate calculations for relevant problems - Quantum imaginary time evolution • Transcorrelation, active spaces. spin-symmetry and adaptive quantum Ansätze TC-VarOITE Fewer gubits DAPT-TC-VarOITE Fewer gates



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HPC+QC toolkit to study strongly correlated quantum chemistry problems Simulation of bio-chemical transition metal compounds relevant for the green energy transition





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WP2

Algorithms and software for relevant insights:

- Electronic properties
- Quantum embedding
- Excited states
- Efficient QC+HPC implementation



AI 4 Quantum

Novel ML approaches for the computational study of complex quantum systems

Neural Network States for Quantum Matter

- \bullet Compress exponential complexity of target solution, $\Psi(\mathbf{x})$
- Reinforcement learning approach
- Resource reduction: physicsinformed, symmetry-preserving neural quantum states



Al-driven Quantum Computing Approaches

- Increase noise-resilience and optimization of quantum algorithms
- ML optimization of quantum circuit Ansätze for $\Psi(\mathbf{x})$: Gates, parameters $\boldsymbol{\theta}$ and transferability



Al-enhanced Quantum Monte Carlo Methods

- Extend reach and acc. of QMC
- Al-enhanced FCIQMC: Agent-based sampling of exponential state space
- Big data ML approach for optimal sampling



Quantum.Al

Novel ML approaches for the computational study of complex quantum systems

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AI 4 Quantum – Dresden-concept / ScaDS.AI

Al 4 Quantum

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AI 4 Quantum – Dresden-concept / ScaDS.AI

Al 4 Quantum

Novel ML approaches for the computational study of complex quantum systems













- Hartree-Fock is in QMA - PCCP, **15**, 397
- Even if GS search is in QMA
 PRX Quantum 3, 020322
 maybe we still find efficient algorithms
- Quantum dynamics is known to be efficient
 - \rightarrow Quantum phase estimation
 - arXiv:quant-ph/0606179

Unitary op. Phase $\hat{U}|\Psi
angle={
m e}^{i heta}|\Psi
angle$ Eigenstate

Unitary op. Phase
$$\hat{U}|\Psi
angle={
m e}^{i heta}|\Psi
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Eigenstate

$$\hat{H} \left| \Psi \right\rangle = E \left| \Psi \right\rangle$$

Unitary op. Phase
$$\hat{U}|\Psi
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 Eigenstate

$$\hat{H} |\Psi\rangle = E |\Psi\rangle$$

$$\downarrow$$

$$\mathbf{e}^{-i\hat{H}t} |\Psi\rangle = \mathbf{e}^{-iEt} |\Psi\rangle$$



No matrix diagonalization! Subroutine of Shor's algorithm

$$\hat{H} |\Psi\rangle = E |\Psi\rangle$$

$$\downarrow$$

$$\mathbf{e}^{-i\hat{H}t} |\Psi\rangle = \mathbf{e}^{-iEt} |\Psi\rangle$$

Probabilities



No matrix diagonalization! Subroutine of Shor's algorithm

Schrödinger eq. $\hat{H} |\Psi\rangle = E |\Psi\rangle$ $e^{-iHt} |\Psi\rangle = e^{-iEt} |\Psi\rangle$ 0.8 $\sum_{i} c_i$ 0.6 0.4 0.2 046 0.0



No matrix diagonalization! Subroutine of Shor's algorithm

$$\hat{H} |\Psi\rangle = E |\Psi\rangle$$

$$\downarrow$$

$$e^{-i\hat{H}t} |\Psi\rangle = e^{-iEt} |\Psi\rangle$$

- Many qubits, deep circuits \rightarrow requires error corrected quantum devices
- State preparation: how to get good approximations of $|\Psi\rangle$?

VarQITE

Map imaginary-time evolution to parameters $\theta(\tau)$ of Ansatz $|\Phi(\theta(\tau))\rangle \approx |\Psi(\tau)\rangle$



- Imag-time Schrödinger equation, for small $\delta\tau$:

$$e^{-\delta \tau (\hat{H} - E_{\tau})} \approx (1 - \delta \tau (\hat{H} - E_{\tau}))$$

• Variation of $|\Phi(\boldsymbol{\theta}(\tau))\rangle$ w.r.t. to parameters $\partial \theta$:

$$|\Phi(\boldsymbol{\theta}(\tau + \delta \tau))\rangle \approx |\Phi(\boldsymbol{\theta}(\tau))\rangle + \sum_{j} \frac{\partial |\Phi(\boldsymbol{\theta}(\tau))\rangle}{\partial \theta_{j}} \frac{\partial \theta_{j}}{\partial \tau} \delta \tau$$

• McLachlan's variational principle

$$\delta \left| \left(\frac{\partial}{\partial \tau} + (\hat{H} - E_{\tau}) \right) | \Phi(\boldsymbol{\theta}(\tau)) \rangle \right| = 0$$

Evolution of parameters:
$$\dot{\boldsymbol{\theta}} = \mathbf{A}^{-1}\mathbf{C}, \quad A_{ij} = \frac{\partial \langle \Phi |}{\partial \theta_i} \frac{\partial |\Phi \rangle}{\partial \theta_j} \qquad C_i = -\frac{\partial \langle \Phi |}{\partial \theta_i} \hat{H} |\Phi \rangle$$

McLachlan, Molecular Physics, 8(1),39 (1964); McArdle et al., npj Quantum, 5, 75 (2019); Yuan et al. Quantum 3, 191 (2019);

Cusp Condition – The Transcorrelated (TC) Method

Form of the **cusp** is known^{*} \rightarrow describe it with a **wavefunction Ansatz**



The transcorrelated (TC) method: use a Jastrow Ansatz, e^{j} , with optimizable parameters J_{ij} (via VMC[†]) to transform the Hamiltonian:

$$|\Psi(\{\mathbf{r}\})\rangle = \exp\left[\sum_{ij} J_{ij}g(\tilde{r}_{ij})\right] |\Phi(\{\mathbf{r}\})\rangle \quad \rightarrow \quad \hat{H} |\Psi\rangle = E |\Psi\rangle \quad \rightarrow \quad \underbrace{e^{-\hat{H}} \hat{H} e^{\hat{j}}}_{H} |\Phi\rangle = E |\Phi\rangle$$

 $|\Phi
angle$ easier to represent with less basis functions ightarrow immense resource reduction

*Kato (1957); Boys and Handy (1969); Kutzelnigg (1985); WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019) WD, Cohen, Alavi, Giner, JCP 156 (23), 234108 (2022); [†]Haupt, Hosseini, López Ríos, WD, Cohen and Alavi, JCP 158, 224105 (2023);

Scaling of TC – Measurement Cost

$$\bar{H} = \sum_{pq,\sigma} h_q^p a_{p,\sigma}^{\dagger} a_{q,\sigma} + \frac{1}{2} \sum_{pqrs,\sigma\tau} \bar{V}_{rs}^{pq} a_{p,\sigma}^{\dagger} a_{q,\tau}^{\dagger} a_{s,\tau} a_{r,\sigma} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{q,\tau}^{\dagger} a_{r,\lambda}^{\dagger} a_{u,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\sigma}^{\dagger} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{q,\tau}^{\dagger} a_{r,\lambda}^{\dagger} a_{u,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\sigma}^{\dagger} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{q,\tau}^{\dagger} a_{r,\lambda}^{\dagger} a_{u,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\sigma}^{\dagger} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{p,\sigma}^{\dagger} a_{r,\lambda}^{\dagger} a_{u,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\sigma}^{\dagger} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{p,\sigma}^{\dagger} a_{r,\lambda}^{\dagger} a_{r,\lambda} a_{r,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\sigma}^{\dagger} - \frac{1}{6} \sum_{pqrstu,\sigma\tau\lambda} L_{stu}^{pqr} a_{p,\sigma}^{\dagger} a_{p,\sigma}^{\dagger} a_{r,\lambda}^{\dagger} a_{r,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\lambda}^{\dagger} a_{r,\lambda} a_{r,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\lambda} a_{t,\tau} a_{s,\sigma} a_{r,\lambda} a_{t,\tau} a_{$$

- Measurement formally scaling as N^6 , with N being the number of orbitals
- Recently shown that $N^6\mbox{-scaling terms can be}$ neglected to good accuracy*
- **xTC** work on N^4 -scaling approximation[‡]
- Order of magnitude less orbitals: since also no core functions needed in basis set[†]
- Shorter circuit depth, due to more compact ground state!#



* WD et al., Journal of Chemical Physics 156 (23), 234108 (2022); [†]Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019); [‡]ChristImaier, Schraivogel, López Ríos, Alavi, Kats, JCP 159, (1) 014113 (2023); [#]Sokolov, WD, Luo, Alavi, Tavernelli, PR Research 5 (2), 023174 (2023);

Similarity Transformation – Transcorrelated (TC) Method

Describe the cusp condition and/or capture part of correlation with a correlated wavefunction Ansatz \rightarrow incorporate into Hamiltonian!

Instead of $\hat{H}\left|\Psi\right\rangle=E\left|\Psi\right\rangle$ solve the similarity transformed (ST) problem

$$\hat{H} |\Psi\rangle = E |\Psi\rangle, \quad \text{with} \quad |\Psi\rangle = e^{\hat{J}} |\Phi\rangle$$

$$e^{-\hat{J}} \rightarrow | \quad \hat{H} e^{\hat{J}} |\Phi\rangle = E e^{\hat{J}} |\Phi\rangle, \quad \left(\hat{J}^{\dagger} = \hat{J}\right)$$

$$\left(e^{-\hat{J}} \hat{H} e^{\hat{J}}\right) |\Phi\rangle = E e^{-\hat{J}} e^{\hat{J}} |\Phi\rangle = E |\Phi\rangle$$

$$|\mathbf{r}_{i} - \mathbf{r}_{i}|$$

Baker-Campbell-Hausdorff (BCH) exp. to obtain TC Hamiltonian:

$$\bar{H} = e^{-\hat{J}} \hat{H} e^{\hat{J}} = \hat{H} + [\hat{H}, \hat{J}] + \frac{1}{2} [[\hat{H}, \hat{J}], \hat{J}] + \dots$$

For the molecular Hamiltonian the BCH exp. terminates at 2nd order, as only kinetic energy operators in \hat{H} do not commute with $\hat{J}!$

Hirschfelder, JCP, 39, 3145 (1963); Boys and Handy, Proc. R. Soc. A (1969); WD, Luo, Alavi, PRB 99 (7), 075119 (2019); Cohen, Luo, Guther, WD, Tew, Alavi, JCP 151 (6), 061101 (2019); WD, Cohen, Alavi, Giner, JCP 156 (23), 234108 (2022)

Explicitly Correlated methods



Linear behavior in electron-electron distance $r_{ij} = |\mathbf{r}_i - \mathbf{r}_j|$ for small r_{ij} !

$$\begin{array}{ll} {\bf R12 \ methods^*:} & |\Psi\rangle = r_{ij} \ |\Phi\rangle \\ {\bf F12 \ methods^\dagger:} & |\Psi\rangle = f(r_{ij}) \ |\Phi\rangle \ , \quad f(r_{ij}) = \frac{1 - \exp(-\gamma r_{ij})}{\gamma} \end{array}$$

Jastrow Ansatz[‡]:
$$\ket{\Psi}=\mathrm{e}^{\hat{J}}\ket{\Phi}, \quad \hat{J}=\sum_{ij}J_{ij}g(\tilde{r}_{ij})$$

* Kutzelnigg, Theoretica chimica acta 68, 445 (1985); † Ten-no, J. Chem. Phys. 121, 117 (2004); ‡ Jastrow, Phys. Rev. 98, 1479 (1955);

High-T_C Superconductors and the Hubbard Model

Mapping to an effective lattice model:





Strong interaction \Rightarrow highly multiconfigurational

Hubbard, 1963; Kanamori, 1963; Gutzwiller; 1963; Anderson, 1987; Emery, 1987; Zhang and Rice, 1988; Bednorz and Müller, 1986

Reduce circuit depth with Transcorrelation

Suppress energetically unfavourable double occupancies via the Gutzwiller Ansatz:



 \Rightarrow Increased compactness of the right EV, due to downfolding of correlations into Hamiltonian \Rightarrow Does the increased compactness/more single reference character have an impact on the necessary quantum Ansatz depth?

Gutzwiller, PRL 10, 159 (1963); Tsuneyuki, Prog. Theor. Phys. Supp., 176, 134 (2008); Scuseria et al., PRB, 91, 041114 (2015); WD, Luo, Alavi, PRB, 99, 075119 (2019) Sokolov, WD, Luo, Alavi, Tavernelli, Physical Review Research 5 (2), 023174 (2023)

Full Configuration Interaction Quantum Monte Carlo

• *Projector MC method* based on the **imaginary-time Schrödinger equation**, stochastically sampling FCI wavefunction. Integration leads to an iterable equation:

$$i\frac{\partial|\Psi(t)\rangle}{\partial t} = \hat{H}|\Psi(t)\rangle \stackrel{\tau=it}{\to} \frac{\partial|\Psi(\tau)\rangle}{\partial \tau} = -\hat{H}|\Psi(\tau)\rangle \rightarrow |\Psi_{GS}\rangle \propto \lim_{\tau \to \infty} e^{-\tau\hat{H}} |\Phi(\tau=0)\rangle$$

• First order Taylor expansion $e^{-\Delta \tau \hat{H}} \approx 1 - \Delta \tau \hat{H}$ leads to the working equation:

$$c_i(\tau + \Delta \tau) = \left[1 - \Delta \tau H_{ii}\right] c_i(\tau) - \Delta \tau \sum_{j \neq i} H_{ij} c_j(\tau)$$

- Solved stochastically by the *population dynamics* of "walkers" in the discrete Slater determinant (SD) Hilbert space.
- Multireference method and highly accurate solutions for system sizes > (50e, 50o) possible.

Booth, Thom, and Alavi, JCP, 131, 054106 (2009); Guther, ..., WD, ..., Alavi, JCP, 153, 034107 (2020)



for c_i in $|\Psi(\tau)\rangle = \sum c_i |D_i\rangle$

Complete active space self-consistent field method (CASSCF)



- Well-established embedding method in quantum chemistry for the treatment of strongly correlated electron systems
 - Active space consisting of the most important orbitals and electrons treated exactly. Configuration interaction solver (FCIQMC) yields ground state energy and wavefunction $|\Psi_0\rangle$
- Effect of the **environment** (Inactive/Virtual space) accounted for at the mean-field level by orbital rotations.
- One- and two-body reduced density matrices in the active space are needed!

$$\rho_{ij}^{\sigma} = \langle \Psi_0 | a_{i\sigma}^{\dagger} a_{j\sigma} | \Psi_0 \rangle$$

Roos, Taylor, Sigbahn, Chem. Phys., 48, 2, 157 (1980)

The (Graphical) Unitary Group Approach

• Spin-free formulation of non-relativistic Hamiltonian:

$$\hat{H} = \sum_{ij}^{n} t_{ij} \,\hat{E}_{ij} + \frac{1}{2} \sum_{ijkl}^{n} V_{ijkl} \left(\hat{E}_{ij} \hat{E}_{kl} - \delta_{jk} \hat{E}_{il} \right)$$

• Spin-preserving (singlet) excitation operators:

$$\hat{E}_{ij} = \hat{c}^{\dagger}_{i\uparrow}\hat{c}_{j\uparrow} + \hat{c}^{\dagger}_{i\downarrow}\hat{c}_{j\downarrow}, \quad \text{with} \quad [\hat{E}_{ij}, \hat{\mathbf{S}}^2] = 0$$

- same commutation relations as generators of the Unitary Group U(n)
- Gel'fand-Tsetlin (GT) basis: invariant and irreducible, same storage cost as SDs
- Efficient matrix element calculation and excitation generation entirely via the Graphical Unitary Group Approach (GUGA)*, without reference to SDs

Paldus, J. Chem. Phys. 61, 5321 (1974); Gel'fand and Tsetlin, Doklady Akad. Nauk SSSR, 71, 1017 (1950), *Shavitt, Int. J. Quantum Chem., 12, 131 (1977

Spin-free RDMs with GUGA-FCIQMC for CASSCF

Sample one- and two-body RDMs in excitation process:

$$\rho_{ij} = \langle \Psi | \hat{E}_{ij} | \Psi \rangle = \sum_{dd'} c_d^{(l)} c_{d'}^{(l)} \langle d' | \hat{E}_{ij} | d \rangle,$$
$$\Gamma_{jl,ik} = \frac{1}{2} \langle \Psi | \hat{E}_{ij} \hat{E}_{kl} - \delta_{jk} \hat{E}_{il} | \Psi \rangle$$



- Modest computational overhead
- Interfaced with OpenMolcas*
- (22e,26o) active space of Fe₂S₂ model system
- Reveals necessary higher order terms in Heisenberg mapping



* Overy et al., JCP, 141, 244117 (2014); [†]WD, Weser, Bogdanov, Alavi, Li Manni, JCTC 17 (9), 5684 (2021)