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#### **Quantum Error Correction and Applications in Condensed Matter Physics**

U.S. Quantum Information Science School, August 12, 2023, Fermi National Laboratory

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#### **Outline and Take-Home Messages**

- Quantum Computing Applications to Condensed Matter Physics
  - Condensed Matter & Material Science provides a rich & relevant set of problems
    - Difficulty level is often tunable
    - Many classical computational approaches are known to compare to
    - Open question which problems are best suited to demonstrate quantum advantage
  - Hybrid quantum-classical simulations leverage both classical & quantum computing power
    - One example is the variational quantum eigensolver (VQE) (see tutorial yesterday)
  - Simulations of nonequilibrium dynamics are classically hard due to entanglement growth
    - Opportunity for quantum computing



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    - Open question which problems are best suited to demonstrate quantum advantage
  - Hybrid quantum-classical simulations leverage both classical & quantum computing power
    - One example is the variational quantum eigensolver (VQE) (see tutorial yesterday)
  - Simulations of nonequilibrium dynamics are classically hard due to entanglement growth
    - Opportunity for quantum computing
- Quantum Error Correction (QEC)
  - Primary goal of the field that is required to unlock the full potential of quantum computing
  - Main idea: Protect quantum memory from noise and perform fault-tolerant operations
  - Many flavors and QEC codes exist (e.g. QEC Zoo<sup>1</sup>): Here focus on the basic principles.
     [1] www.quantumerrorcorrectionzoo.org



#### **Quantum Error Correction: Basics**



## Motivation and repetition codes

- Errors in a quantum computation are unavoidable due to
  - Contact with environment > leads to decoherence
  - Unitary gate set is continuous > gate errors can be arbitrarily small  $U = U_{ideal}[1 + O(\epsilon)]$
- Quantum Error Correction (QEC) protects quantum information by adding redundant information
  - Same idea as in Classical Error Correction

encoding  $\rightarrow y$  \_\_\_\_\_ noise decoding  $\widetilde{y}$  $\tilde{x}$  $\boldsymbol{x}$  $(000) \in C$  $(001) \notin C$ 0 0  $(011) \notin C$  $(111) \in C$ 1 (000)(011)0 Failure probability:  $3p^2(1-p) + p^2$ 

Code distance

 $d = \min_{x,y \in C} D_H(x,y)$ Errors of weight up to  $\frac{d-1}{2}$ can be corrected

Singe bit flips can be corrected Two bit flips result in logical error



#### **Challenges for QEC**

• Phase errors occur in addition to bit flip errors

$$\frac{|0\rangle \rightarrow |0\rangle}{|1\rangle \rightarrow -|1\rangle} \implies |+\rangle = \frac{1}{\sqrt{2}}[|0\rangle + |1\rangle \rightarrow \frac{1}{\sqrt{2}}[|0\rangle - |1\rangle] = |-\rangle \quad \frac{\text{Phase flips act as bit}}{\text{flips of X eigenstates!}}$$

- Errors can be arbitrarily small and are continuous
- Measurement necessarily causes disturbance
  - Projective measurement projects onto eigenspace of measurement operator
- No cloning theorem (cannot copy quantum information)

 $\begin{array}{ll} \textbf{3-qubit bit flip code} & |\psi\rangle = a|0\rangle + b|1\rangle \\ |0\rangle \rightarrow |\bar{0}\rangle = |000\rangle & \text{Logical operators} \\ |1\rangle \rightarrow |\bar{1}\rangle = |111\rangle & X_L = X_1 X_2 X_3 \\ & Z_L = Z_1 Z_2 Z_3 \end{array}$ 

Encoding circuit:

$$= a|\bar{0}\rangle + b|\bar{1}\rangle$$

Protected against  $\{X_1, X_2, X_3\}$ 

errors.



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#### Bit flip code: error detection via syndrome measurement

• Measure Pauli strings  $(Z_1Z_2, Z_1Z_3) \cong$  yields error syndrome  $(\pm 1, \pm 1)$ 



$$|0\rangle|\bar{\psi}\rangle \rightarrow \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)|\bar{\psi}\rangle \rightarrow \frac{1}{\sqrt{2}}\Big(|0\rangle|\bar{\psi}\rangle + Z_1Z_2|1\rangle|\bar{\psi}\rangle\Big)$$
$$\rightarrow \frac{1}{2}\Big([|0\rangle + |1\rangle]|\bar{\psi}\rangle + Z_1Z_2[|0\rangle - |1\rangle]|\bar{\psi}\rangle\Big) = \frac{1}{2}\Big(1 + Z_1Z_2\Big)|0\rangle|\bar{\psi}\rangle + \frac{1}{2}\Big(1 - Z_1Z_2\Big)|1\rangle|\bar{\psi}\rangle$$

Measurement of ancilla collapses logical qubit to  $\frac{I \pm Z_1 Z_2}{2}$  orthogonal eigenspaces Digitization of error: bit flip either occurs (with small probability) or not.

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#### **Orthogonal error subspaces**



- Ancilla measurement discretizes error by projecting states onto orthogonal and undeformed error subspaces
- Recovery operation associated with each syndrome outcome  $(\pm 1, \pm 1)$





#### Two and three bit flip errors are not correctable



- Two-bit flip errors is erroneously corrected IP logical error
- Three-bit flip error correspond to logical operation and cannot be detected



#### Challenges for QEC: almost all addressed in bit flip code

• Phase errors occur in addition to bit flip errors imes (still need to be addressed)

- Errors can be arbitrarily small and are continuous
  - Ancilla measurement discretizes errors (either they occur or not)
- Measurement necessarily causes disturbance
  - Projective measurement projects onto eigenspace of measurement operator
  - Measurement of syndrome operators does not affect information encoded in code subspace C
  - Projection is actually a good thing  $\checkmark$
- No cloning theorem (cannot copy quantum information)
  - We never copied the state  $|\psi
    angle=a|0
    angle+b|1
    angle$



#### Phase flip code

Phase errors occur in addition to bit flip e 

 $|+\rangle$ 

$$= \frac{1}{\sqrt{2}}[|0\rangle + |1\rangle \rightarrow \frac{1}{\sqrt{2}}[|0\rangle - |1\rangle] = |-\rangle \quad \begin{array}{l} \text{Phase flips act as bit} \\ \text{flips of X eigenstates!} \end{array}$$

3-qubit phase flip code

 $\begin{array}{l} |0\rangle \rightarrow |0\rangle \\ |1\rangle \rightarrow -|1\rangle \end{array}$ 

$$|0\rangle \rightarrow |\bar{0}\rangle = |+++\rangle = \frac{1}{\sqrt{2}}(|0\rangle + |1\rangle)^{\otimes 3}$$
$$|1\rangle \rightarrow |\bar{1}\rangle = |---\rangle = \frac{1}{\sqrt{2}}(|0\rangle - |1\rangle)^{\otimes 3}$$

Encoding circuit:



Protected against  $\{Z_1, Z_2, Z_2\}$  errors.

Syndrome measurements

$$(X_1X_2, X_1X_3) = (\pm 1, \pm 1)$$





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#### Combine bit and phase flip code: Shor's 9-qubit code

- Shor's 9-qubit code protects against all single bit and phase flip errors and their combination
- Codewords

$$\begin{aligned} |0\rangle \to |\bar{0}\rangle &= \frac{1}{2^{3/2}} (|000\rangle + |111\rangle) (|000\rangle + |111\rangle) (|000\rangle + |111\rangle) \\ |1\rangle \to |\bar{1}\rangle &= \frac{1}{2^{3/2}} (|000\rangle - |111\rangle) (|000\rangle - |111\rangle) (|000\rangle - |111\rangle) \end{aligned}$$

- Detect bit flips by syndrome measurements of  $(Z_1Z_2, Z_1Z_3, Z_4Z_5, Z_4Z_6, Z_7Z_8, Z_7Z_9)$
- Detect phase flips by syndrome measurements  $(X_1X_2X_3X_4X_5X_6, X_4X_5X_6X_7X_8X_9)$
- Information encoded nonlocally





#### **Code distance and uncorrectable errors**

Two bit flips in a single cluster of three qubits cannot be corrected (instead we
incorrectly apply X<sub>3</sub>)

$$\begin{array}{l}X_3X_1X_2|\bar{0}\rangle = |\bar{0}\rangle\\X_3X_1X_2|\bar{1}\rangle = -|\bar{1}\rangle\end{array} \implies Z_L(a|\bar{0}\rangle + b|\bar{1}\rangle = a|\bar{0}\rangle - b|\bar{1}\rangle \quad \text{results in a logical phase flip}\end{array}$$

• Two phase flips in different clusters cannot be corrected

$$Z_7 Z_1 Z_4 |\bar{0}\rangle = |\bar{1}\rangle$$

$$Z_7 Z_1 Z_4 |\bar{1}\rangle = |\bar{0}\rangle$$

$$X_L (a|\bar{0}\rangle + b|\bar{1}\rangle = a|\bar{1}\rangle + b|\bar{0}\rangle$$
results in a logical bit flip

Only weight t=1 Pauli errors can be corrected ☞ Code distance d = 2t + 1 = 3
 Are there two qubit errors that can be corrected?
 Shor's code is a [[n, k, d]] = [[9, 1, 3]] code.

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#### **Error probability**

- Unencoded qubit: failure with probability p
- Shor's logical qubit
  - Logical phase error requires two bits on the same cluster to flip
    - Upper bounded by  $p_{L, {\rm phase}} \leq 3 \binom{3}{2} \Bigl(\frac{2}{3}p\Bigr)^2 = 4p^2$
  - Logical bit flip error requires two bits on different clusters to undergo phase error
    - Upper bounded by

$$p_{L,\text{bit}} \le {\binom{3}{2}} 3^2 {\left(\frac{2}{3}p\right)}^2 = 12p^2$$

Encoding is advantageous for

$$p_{L,\text{tot}} = 16p^2 \le p^2 \Rightarrow p < 1/16$$

• Encoded qubit has smaller failure rate for small enough physical failure rate



## **Conditions for Quantum Error Correction**

- Define set of correctable errors  $\mathcal{E} \subseteq \mathcal{P}_n = \{I, X, Y, Z\}^{\otimes n}$ 
  - Typical example: all Pauli errors of weight  $\leq t$
- Starting from any state  $|\bar{i}\rangle \in C$  , wish to undo any action composed of errors in  ${\cal E}$

Error map (Stinespring  
dilation representation): 
$$|\bar{i}\rangle|0\rangle_E \rightarrow \sum_{\mu} M_{\mu}|\bar{i}\rangle|\mu\rangle_E$$
 Error entangles system  
with environment!  
orthonormal states  
Kraus operators  $M_{\mu} = \sum_{a} c_{\mu a} P_a$ 

• Can reverse errors if there exists a recovery superoperator defined via  $\{R_{\nu}\}$  such

that

$$\sum_{\nu,\mu} R_{\nu} M_{\mu} |\bar{i}\rangle |\mu\rangle_{E} |\nu\rangle_{A} = |\bar{i}\rangle |\text{stuff}\rangle_{EA}$$

$$R_{\nu}M_{\mu}|\bar{i}\rangle = \lambda_{\nu\mu}|\bar{i}\rangle$$

- Entanglement has been shifted to occur between environment & ancillas
  - State |stuff><sub>EA</sub> must not depend on i
  - $R_{\nu}M_{\mu}$  acts as identity on codespace C



#### **Conditions for Quantum Error Correction**

Using completeness condition  $\sum R_{\nu}^{\dagger}R_{\nu} = I$ , we find •

$$\begin{split} M_{\delta}^{\dagger}M_{\mu}|\bar{i}\rangle &= M_{\delta}^{\dagger}(\sum_{\nu}R_{\nu}^{\dagger}R_{\nu})M_{\mu}|\bar{i}\rangle = \sum_{\nu}\lambda_{\nu\delta}^{*}\lambda_{\nu\mu}|\bar{i}\rangle \\ \\ \text{Also acts as identity on} \\ \text{codespace C} \\ R_{\nu}M_{\mu}|\bar{i}\rangle &= \lambda_{\nu\mu}|\bar{i}\rangle \end{split}$$

• Necessary and sufficient condition on codespace C for allowing errors in  $\mathcal{E}$  to be corrected is  $\langle \bar{i} | M_{\sharp}^{\dagger} M_{\mu} | \bar{i} \rangle = C_{\delta \mu} \delta_{i i}$ 

Since 
$$M_{\mu} = \sum_{a} c_{\mu a} P_{a}$$

this implies

$$\langle \bar{j}|P_b P_a|\bar{i}\rangle = C_{ba}\delta_{ij}$$
 for  $P_a, P_b \in \mathcal{E}$ 



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#### **Alternative derivation of QEC condition**

• Consider the code block is in any state  $|\bar{\psi}\rangle$  and then an error acts:

$$|\bar{\psi}\rangle|0\rangle_E \to \sum_{\mu} M_{\mu}|\bar{\psi}\rangle|\mu\rangle_E$$

- The reduced density matrix of the environment must not carry any information about the state  $|\bar\psi\rangle$ 

$$\rho_E = \sum_{\mu,\nu} |\mu\rangle_E \langle \bar{\psi} | M_{\nu}^{\dagger} M_{\mu} | \bar{\psi} \rangle \langle \nu |_E$$
Must be independent of  $|\bar{\psi}\rangle = \sum_i c_i |\bar{i}\rangle$ 

$$\rho_E = \sum_{i,j} \sum_{\mu,\nu} c_i^* c_j |\mu\rangle_E \langle \bar{i} | M_{\nu}^{\dagger} M_{\mu} | \bar{j} \rangle \langle \nu |_E$$
Independence from  $c_i$  implies that  $\langle \bar{i} | M_{\nu}^{\dagger} M_{\mu} | \bar{j} \rangle = C_{\nu\mu} \delta_{ij}$ . Used that  $\sum_i |c_i|^2 = 1$ 



#### Example: Shor's code and one weight Pauli errors

$$|0\rangle \to |\bar{0}\rangle = \frac{1}{2^{3/2}} (|000\rangle + |111\rangle) (|000\rangle + |111\rangle) (|000\rangle + |111\rangle) |1\rangle \to |\bar{1}\rangle = \frac{1}{2^{3/2}} (|000\rangle - |111\rangle) (|000\rangle - |111\rangle) (|000\rangle - |111\rangle)$$

$$\langle \bar{j} | P_b P_a | \bar{i} \rangle = C_{ba} \delta_{ij}$$
 for  $P_a, P_b \in \mathcal{E}$ 

$$\langle \bar{0} | X_a X_b | \bar{0} \rangle = \delta_{ab}$$
$$\langle \bar{1} | X_a X_b | \bar{0} \rangle = 0$$
$$\langle \bar{1} | X_a X_b | \bar{1} \rangle = \delta_{ab}$$
$$\langle \bar{0} | Z_a Z_b | \bar{0} \rangle = \delta_{ab}$$
$$\langle \bar{1} | Z_a Z_b | \bar{0} \rangle = 0$$
$$\langle \bar{1} | Z_a Z_b | \bar{1} \rangle = \delta_{ab}$$

- Same holds for *Y*<sub>a</sub> operators
- But, if one of the Paulis is X2\*X3

$$\begin{split} \langle \bar{0} | X_1 X_2 X_3 | \bar{0} \rangle &= 1 \\ \langle \bar{1} | X_1 X_2 X_3 | \bar{0} \rangle &= 0 \\ \langle \bar{1} | X_1 X_2 X_3 | \bar{1} \rangle &= -1 \end{split}$$

No longer independent of i,j. Thus, X2\*X3 cannot be corrected.



#### Shor's code as stabilizer code

- Pauli group  $\mathcal{P}_n = \{\pm 1, \pm i\} \times \{I, X, Y, Z\}^{\otimes n}$
- Stabilizer code subspace is defined by a (stabilizer) subgroup  $S \subset P_n$  as the vector subspace that is fixed by all the elements in  $S \subset P_n$

$$\mathcal{C} = \{ |\psi\rangle \in \mathcal{H} | S | \psi\rangle = |\psi\rangle \, \forall S \in \mathcal{S} \}$$

Joint +1 eigenspace of set of commuting Pauli strings

- Stabilizer group must not contain (-I) and it is Abelian
- Sufficient to define the codespace via the generators of the stabilizer group only
- For 3-qubit bit flip code:  $S = \langle Z_1 Z_2, Z_1 Z_3 \rangle$
- For Shor's 9-aubit code:

 $\{Z_1Z_2, Z_2Z_3, Z_4Z_5, Z_5Z_6, Z_7Z_8, Z_8Z_9, X_1X_2X_3X_4X_5X_6, X_4X_5X_6X_7X_8X_9\}.$ 

- Set of logical Pauli gates = set of Pauli operators that commute with all stabilizers = centralizer of  $S \subset P_n$ Alternatively:  $\overline{Z} = X_1 X_2 X_3$   $\overline{X} = Z_1 Z_4 Z_7$ 
  - Example:  $\overline{Z} = X_1 X_2 X_3 X_4 X_5 X_6 X_7 X_8 X_9$  and  $\overline{X} = Z_1 Z_2 Z_3 Z_4 Z_5 Z_6 Z_7 Z_8 Z_9$



#### Surface code



• Planar version of Kitaev's toric code

$$H = -\sum_{v} A_{v} - \sum_{p} B_{p}$$
$$A_{v} = \prod_{i \in v} X_{i}, \ B_{p} = \prod_{i \in p} Z_{i}$$

- Data qubits (open circles) on bonds of square lattice
- Local Z and X stabilizers
  - Z checks are product of four Z's around plaquette
  - X checks are product of four X's along star
- GS space is stabilizer space

Kitaev (1997); Dennis et al. (2002); Fowler et al. (2012); Cleland, Sci. Post Lecture Notes (2022)



## Logical qubit in surface code $\hat{Z}_L$



- 41 qubits =  $2 \times 41$  degrees of freedom
- 20 Z and 20 X checks = 2 x 40 constraints
- 2 unconstrained degrees of freedom left
   = 1 qubit

• State 
$$|\psi\rangle = |u\rangle_L \otimes |v\rangle = 2^{40}$$

dimensional space. Fixed to be a unique state by stabilizer measurements.

Logical operators

Logical qubit

- X<sub>L</sub> bit flips five qubits, Z<sub>L</sub> phase flips five qubits ((change state of array)
- $X_L$  connects X boundaries,  $Z_L$  connects Z boundaries. Here, code distance d = 5.



#### **Fault-tolerant quantum computations**

- Compute directly on encoded logical qubits (no decoding necessary)
- Must prevent propagation and accumulation of errors
- Example: logical CNOT for 3-qubit bit flip code



Further reading:

- Nielsen, Chuang, Ch. 10.6
- Cleland, Sci. Post Lecture notes on fault-tolerant gate implementation in surface code

Assume that the only sources of errors are individual controlled-not gates which produce bit-flip errors in their outputs. Which of the two implementations is fault-tolerant?



#### **Summary of Quantum Error Correction part**

- Quantum Error Correction protects quantum memory from a chosen set of correctable errors
  - Typically chosen as Pauli errors below some weight
- Quantum information is encoded nonlocally (locality assumption of the errors)
- Failure probability reduced for sufficient small failure rate of physical qubits
- Different codes exist [[n, k, d]], specified by n = number of physical qubits per block, k = number of logical qubits per block, d = distance determines the maximal weight of errors that can be corrected: d = 2 t + 1
- Examples discussed: bit-flip, phase-flip, Shor code, surface code
- Outlook:
  - Classical codes, CSS codes, stabilizer codes, Qudit codes,
  - Bosonic codes for continuous variable systems
  - Fault-tolerant implementation of universal gate set

Check out:

- arthurpesah.me/blog
- J. Roffe, arXiv:1907.11157
- Nielsen, Chuang, Ch. 10
- Preskill, Lecture Notes, Ch.6
- Rieffel, Polak "Introduction to QC" book



#### **Quantum Computing Applications in Condensed Matter Physics** Focus on near-term applications in pre-fault-tolerant era



## **Condensed Matter Physics & Materials Science**

• Fueled by the many possibilities to combine atoms into (periodic) structures



- Goal: Understand & predict quantum materials' properties
  - Equilibrium behavior: phase diagrams, response functions at T=0 and T>0
  - Nonequilibrium behavior: driven systems, quenches, metastable states, kinetic pathways



#### **Common theoretical approach: separation of scales**

- Workflow of building realistic effective models for solids
  - Start with atomistic description (theory of everything)



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- · Workflow of building realistic effective models for solids
  - Start with atomistic description (theory of everything) >> Born-Oppenheimer approximation
     >> treat Coulomb interactions approximately, e.g. within Density Functional Theory (DFT)

$$[T_e + V_{ee} + T_i + V_{ii} + V_{ei}]\Phi(\mathbf{r}, \mathbf{R}) = E^{tot} \cdot \Phi(\mathbf{r}, \mathbf{R})$$



#### **Downfolding to most important electronic orbitals**

- Workflow of building realistic effective models for solids
  - Start with atomistic description (theory of everything) >> Born-Oppenheimer approximation
     >> treat Coulomb interactions approximately, e.g. within Density Functional Theory (DFT)
  - Downfold to low-energy states near Fermi surface (e.g. derive electronic Wannier wavefunctions) and build an effective (Hubbard-like) model
  - Effective model treats Coulomb interactions more accurately

#### Example for illustration: NdNiO2, taken from Been et al, PRX (2021).





#### Effective multiorbital Hubbard-Hund models & spin models

- Workflow of building realistic effective models for solids
  - Start with atomistic description (theory of everything) >> Born-Oppenheimer approximation
     >> treat Coulomb interactions approximately, e.g. within Density Functional Theory (DFT)
  - Downfold to low-energy states near Fermi surface (e.g. derive electronic Wannier wavefunctions) and build an effective (Hubbard-like) model
  - Effective model treats Coulomb interactions more accurately
  - Apply further approximations to the model, e.g. derive spin model in strong interaction limit
  - Compute phase diagram and response functions of effective model



#### Numerical approaches to effective models

- Solve a small instance of the effective model
  - Exact Diagonalization, Quantum Monte Carlo, Matrix Product States, Tensor Networks, QC
  - Extrapolate to larger systems

Example: Exact diagonalization of spin-1/2 models. Limited to N < 40.

$$\begin{array}{l} 0\rangle = |\downarrow,\downarrow,\downarrow,\downarrow,\ldots,\downarrow\rangle & (=0\ldots000) \\ 1\rangle = |\uparrow,\downarrow,\downarrow,\ldots,\downarrow\rangle & (=0\ldots001) \\ 2\rangle = |\downarrow,\uparrow,\downarrow,\ldots,\downarrow\rangle & (=0\ldots010) \\ 3\rangle = |\uparrow,\uparrow,\downarrow,\ldots,\downarrow\rangle & (=0\ldots011) \end{array}$$

 $H_{ij} = \langle i|H|j\rangle$  $i, j = 0, \dots, 2^N - 1$ 

#### The Lanczos method

If we need only the ground state and a small number of excitations

- · can use "Krylov space" methods, which work for much larger matrices
- basis states with 10<sup>7</sup> states or more can be easily handled (30-40 spins)

#### The Krylov space and "projecting out" the ground state

Start with an arbitrary state  $|\psi\rangle$ 

• it has an expansion in eigenstates of H; act with a high power  $\Lambda$  of H

$$H^{\Lambda}|\Psi\rangle = \sum_{n} c_{n} E_{n}^{\Lambda}|n\rangle = E_{0}^{\Lambda} \left(c_{0}|0\rangle + c_{1} \left(\frac{E_{1}}{E_{0}}\right)^{\Lambda}|1\rangle + \ldots\right)$$

For large  $\Lambda$ , if the state with largest IE<sub>n</sub>I dominates the sum

- one may have to subtract a constant, H-C, to ensure ground state
- $\bullet$  even better to use linear combination of states generated for different  $\Lambda$

$$|\psi_a
angle = \sum_{m=0}^{\Lambda} \psi_a(m) H^m |\Psi
angle, \quad a = 0, \dots, \Lambda$$

• diagonalize H in this basis

From Sandvik, Lecture Notes (2009)



#### Numerical approaches to effective models

- Embedding Methods
  - Map lattice problem onto impurity model (= small part of the system) coupled to a reservoir (= the rest of the system)
  - Solve self-consistently using ED, QMC, etc to treat the interacting impurity model
  - Becomes exact as the size of the impurity cluster increases









#### **Opportunities for Quantum Computing**

- QC avoids memory bottleneck of classical methods
  - Exponential growth of Hilbert space with system size limits classical methods such as ED
  - Instead: quantum computer can handle exponentially many wavefunction amplitudes ("Nature is not classical", Feynman)



## **Opportunities for Quantum Computing**

- QC avoids memory bottleneck of classical methods
  - Exponential growth of Hilbert space with system size limits classical methods such as ED
  - Instead: quantum computer can handle exponentially many wavefunction amplitudes ("Nature is not classical", Feynman)
- QC can deal with highly entangled states
  - Matrix Product States and Tensor Networks are efficient ways to compress a wavefunction
  - The memory requirement is set by the bond dimension that grows as  $e^{S}$ , where S is the entanglement entropy after tracing out part of the system
  - Essentially exact if the wavefunction carries a limited amount of entanglement: constant or logarithmically growing *S* with system size
  - Breaks down if *S* grows with system size (volume law)
  - Ground states are often area law entangled (1D gapped states)
  - Excited states generically carry volume law entanglement
    - Relevant at T>0 & in nonequilibrium



## **Algorithms for Ground State Preparation**

- Variational quantum eigensolver (VQE)
- Other notable directions (not covered here)
  - Quantum imaginary time evolution
    - Motta et al., Nature Physics (2020); Ardle et al., (2019)
    - Gomes et al., Adv. Qu. Tech. (2021)
  - Subspace expansion techniques
    - McClean *et al.*, (2017)
    - Bharti et al., Review of Modern Physics (2022).



## Variational Quantum Eigensolver



Early work: Peruzzo et al., (2013)

#### From Bharti et al., RMP (2022)

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## VQE for Kitaev square-octagon lattice model in magnetic field



Kitaev model on square-octagon lattice matches Rigetti's QPU geometry. No SWAP gates needed as connectivities match.

From: Li et al. (SQMS), PRR (2023). Kitaev model (2.2) on the square-octagon lattice as a function of spin exchange anisotropy  $J_{\perp}/J_z$  with  $J_{\perp} \equiv J_x = J_y$ and magnetic field in [111] direction  $h_{[111]}$ . It includes gapped toric code phases (TC<sub>z</sub>, TC<sub>xy</sub>) that are stable with respect to small fields, the gapless line (GL) at  $J_{\perp}/J_z = 1/\sqrt{2}$  and a phase with non-Abelian (nA) Majorana excitations that emerges in field above the gapless line. At large magnetic fields the system enters a spin-polarized paramagnetic phase. The red circles denote the different, representative model parameter points that are studied in our benchmark simulations.



#### Parametrized quantum circuit (HVA ansatz)



FIG. 3. **HVA with one layer on eight qubits**. The Hamiltonian Variational Ansatz (HVA) with one layer on eight qubits, split into commuting blocks. The first block corresponds to the operation  $e^{-i\tilde{\alpha}\sum_{q}X_{q}} e^{-i\alpha\sum_{(i,j)\in X-\text{links}}X_{i}X_{j}}$ , the second to  $e^{-i\tilde{\beta}\sum_{q}Y_{q}} e^{-i\beta\sum_{(i,j)\in Y-\text{links}}Y_{i}Y_{j}}$ , and the third to  $e^{-i\tilde{\gamma}\sum_{q}Z_{q}} e^{-i\gamma\sum_{(i,j)\in Z-\text{links}}Z_{i}Z_{j}}$ . For the circuit shown here, we used  $X-\text{links} = \{(q_{0}, q_{1}), (q_{2}, q_{3})\}, Y-\text{links} = \{(q_{0}, q_{3}), (q_{1}, q_{2})\}$ , and  $Z-\text{links} = \{(q_{0}, q_{4}), (q_{1}, q_{5}), (q_{2}, q_{6}), (q_{3}, q_{7})\}$ .



#### **Statevector and QASM simulations**



#### Conclusions

- Shot noise makes optimization more challenging
- Start from preoptimized solutions for larger systems
- Subspace expansion techniques avoid classical optimization loop (still require many measurements)





Optimizer	Error (noiseless)	Measured deviation	Cost function evaluations
BFGS, 501 initial values	0.45069	0.42052	mean: 747, max: 1994
BOBYQA, 501 initial values	0.27485	0.21843	mean: 471, max: 610
BOBYQA-noisy, 501 initial values	0.07989	-0.00453	mean: 3532, max: 4004
CMA-ES	0.02416	-0.06462	37570
CMA-ES, 80 initial values	0.01610	-0.07125	mean: 21042, max: 52000
Dual annealing	0.04534	-0.01631	60101
SPSA	0.00612	0.00879	100000 (cutoff)



#### Variational quantum eigensolver for excited states

- Variational quantum eigensolver to prepare highly excited states (VQE-X)
- Minimize energy variance (instead of energy):

 $\mathcal{C}(|\psi(\boldsymbol{\theta}\rangle) = \langle \psi(\boldsymbol{\theta}) | H^2 | \psi(\boldsymbol{\theta}) \rangle - \langle \psi(\boldsymbol{\theta}) | H | \psi(\boldsymbol{\theta}) \rangle^2$ 



Full coverage of energy spectrum for operator pool with longrange Pauli strings

 $\mathscr{P}_{\max} = \{Y_i\}_{i=1}^N \cup \{Y_i Z_j\}_{i,j=1}^N \cup \{Y_i X_j\}_{i,j=1}^N$ 

Can investigate properties of volume law highly excited states

Adaptive ansatz

fixed ansatz

dependence

Nontrivial pool

construction instead of



Zhang, Gomes, Yao, PPO, Iadecola, PRB **104**, 075159 (2021).





#### Variational quantum eigensolver for excited states

- Variational quantum eigensolver to prepare highly excited states (VQE-X)
- Minimize energy variance (instead of energy):

$$\mathcal{C}(|\psi(\boldsymbol{\theta}\rangle) = \langle \psi(\boldsymbol{\theta}) | H^2 | \psi(\boldsymbol{\theta}) \rangle - \langle \psi(\boldsymbol{\theta}) | H | \psi(\boldsymbol{\theta}) \rangle^2$$



- Exponential scaling of # CNOTs with system size
- Relax convergence condition to represent microcanonical averages instead, see Pollock, PPO, ladecola, arXiv:2301.04129 (2023).

Zhang, Gomes, Yao, PPO, Iadecola, PRB **104**, 075159 (2021).



#### **Algorithms for Quantum Dynamics Simulations**



#### **Applications of real-time dynamics**

- Investigate nonequilibrium behavior
  - Chemical reactions
  - Scattering experiments
  - Phase transformations, synthesis, metastable states, kinetic pathways, quenches
  - Fundamental questions: thermalization of a closed quantum system (eigenstate thermalization hypothsis, many-body localization)
  - Scaling behavior in nonequilibrium: transport, nonequilibrium dynamics of order parameters and correlation functions (coarsening, aging)
- Adiabatic state preparation
  - Preparing ground states of Hamiltonians

 $H(t) = H_0(1 - t/T) + H_1t/T, \ 0 \le t \le T$ 

Here, we focus on far-from-equilibrium behavior



#### **Quantum dynamics simulations**



- Classically hard due to rapid growth of entanglement in nonequilibrium for generic H
  - Reason: contains highly excited states > Volume-law entanglement entropy.
  - Need many parameters to classically represent the quantum state
- Quantum simulators and computers can naturally time-evolve a quantum state





 $|\Psi(t)\rangle = \sum c_n e^{-iE_n t} |n\rangle$ 

#### **Entanglement growth makes classical simulations hard**



• Time-evolved state  $|\Psi(t)\rangle = \sum c_n e^{-iE_n t} |n\rangle$  is strongly entangled

• Contains highly excited states of H > Volume-law entanglement

Minimal dimension of matrix product operators (MPO) grows exponentially in time for nonintegrable models (mixed-field Ising model)



Growth is polynomially for integrable models (transverse-field Ising model)

 $H(h^{x}, h^{z}) = \sum_{j=0}^{n-2} \sigma_{j}^{x} \sigma_{j+1}^{x} + \sum_{j=0}^{n-1} (h^{x} \sigma_{j}^{x} + h^{z} \sigma_{j}^{z})$ 

FIG. 3.  $D_{\epsilon}(t)$  for local initial operators. We consider three cases  $O(0) = \sigma_{n/2}^{x,y,z}$  (empty circles, squares, and triangles), for nonintegrable evolution  $H_C$ , and four cases,  $O(0) = \sigma_{n/2}^{x,y}$  (full squares, diamonds),  $\sigma_{n/2-1}^z \sigma_{n/2}^y$  (full triangles) with infinite index, and  $O(0) = \sigma_{n/2-1}^z \sigma_{n/2}^z$  (full circles) with index 2, for integrable evolution  $H_R$ .



#### **Entanglement growth makes classical simulations hard**



• Time-evolved state  $|\Psi(t)\rangle = \sum c_n e^{-iE_n t} |n\rangle$  is strongly entangled

• Contains highly excited states of  $H \ge Volume-law$  entanglement

Minimal dimension of matrix product operators (MPO) grows exponentially in time for nonintegrable models (mixed-field Ising model)

Entanglement entropy  $S_A = -\text{Tr}[\rho_A \ln \rho_A]$ 

Reduced density matrix  $ho_A = {
m Tr}_B 
ho$ 



Prosen, Znidaric (2007)

Growth is polynomially for integrable models (transverse-field Ising model)

Entanglement entropy grows ballistically  $\propto t$  after global quench





#### Dynamics simulations are opportunity for quantum advantage





• Time-evolved state  $|\Psi(t)
angle = \sum c_n e^{-iE_n t} |n
angle$  is strongly entangled

• Contains highly excited states of H > Volume-law entanglement

#### Entanglement = complexity of classical calculation

Exponential growth of classical resources like the bond dimension in tensor networks. Exact diagonalization is limited by memory.

Opportunity for quantum computing

# Quench dynamics in Heisenberg model $S_{A}$ 2.5 2.0 1.5 1.0 $H = \frac{J}{4} \sum_{i=1}^{L} (X_{i}X_{i+1} + Y_{i}Y_{i+1} + Z_{i}Z_{i+1})$ $|\psi(t)\rangle = e^{-iHt} |010101 \cdots \rangle$ 0.0 0 5 10 15 20

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#### **Overview of quantum algorithms for dynamics simulations**



[1] Berry et al. (2015); [2] Childs (2004); [3] Low, Chuang (2017); [4] Childs et al., PNAS (2018); [5] Li, Benjamin, Endo, Yuan (2019); Y. Yao, PPO, T. Iadecola *et al.* (2021).

- Lie-Suzuki-Trotter Product formulas (PF)
  - Simple yet limited to early times for current hardware noise
  - Trotter circuit depth scales as  $\mathcal{O}(t^{1+1/k})$  fixed  $t_f$
- Algorithms with best asymptotic scaling have significant overhead
  - Linear combination of unitaries (TS) [1], quantum walk methods [2], quantum signal processing (QSP) [3]
- Hybrid quantum-classical variational methods [5,6]
  - Work with fixed gate depth is ideally tailored for NISQ hardware
  - Trading gate depth for doing many QPU measurements



#### **Trotter Product Formula approach**

- Trotter decomposition of time evolution operator
- Decompose Hamiltonian into sum of terms that include commuting operators
- Example: Mixed-field quantum Ising model

$$H = H_{ZZ} + H_Z + = V \sum_{i=1}^{L-1} Z_i Z_{i+1} - 2V \sum_{i=2}^{L-1} Z_i - V(Z_1 + Z_L) + \Omega \sum_{i=1}^{L} X_i.$$
One step of Trotter circuit

Time evolution operator in 1<sup>st</sup> order Trotter approximation

$$U(\Delta t) \approx e^{-iH_{ZZ}\Delta t}e^{-iH_{Z}\Delta t}e^{-iH_{X}\Delta t}$$

 $R_X( heta_i^X) = e^{-i heta_i^X X_i/2}$  $R_Z( heta_i^Z) = e^{-i heta_i^Z Z_i/2}$  $R_{ZZ}(\theta_i^{ZZ}) = e^{-i\theta_i^{ZZ}Z_iZ_{i+1}/2}$ 

Standard decomposition of RZZ into CNOT and RZ







in I = 5system, starting in Neel state.

#### NISQ Trotter simulations of mixed field Ising model

 Benchmark Trotter simulations of mixed-field Ising model on current NISQ hardware

$$H = H_{ZZ} + H_Z + H_X = V \sum_{i=1}^{L-1} Z_i Z_{i+1} - 2V \sum_{i=2}^{L-1} Z_i - V(Z_1 + Z_L) + \Omega \sum_{i=1}^{L} X_i.$$

Displays many-body coherent dynamics for  $V \gg \Omega$ 

Bernien, Lukin (2017)

Naïve Trotter simulation limited to short times due to finite device coherence time



One step of Trotter circuit in L=5 system, starting from Neel state.

Use pulse level control and error mitigation to extend simulation time



#### Pulse level control and quantum error mitigation (QEM)

- Pulse level control allows to make optimal use of finite coherence time on device
   Direct implementation of *R*ZZ gate via cross-resonance pulse >> cuts program in half
- Quantum error mitigation further extends final time of simulation
  - Readout error mitigation (tensor product assumption):  $C_{\text{ideal}} = M^{-1}C_{\text{noisy}}$ .  $M = \begin{bmatrix} 1 \epsilon_1 \\ \eta_1 \end{bmatrix} \otimes \cdots$
  - Zero-noise extrapolation (ZNE) after increasing noise via gate folding  $G \mapsto GG^{\dagger}G$ .
  - Pauli twirling: transforming noise to Pauli error channel  $N_{\Lambda\rho} = \sum_{h} E_{h\rho} E_{h}^{\dagger} = E_{h\rho}$
  - Dynamical decoupling: apply  $X(\pi)$  and  $X(-\pi)$  during qubit idle time
  - Symmetry-based postselection: physically motivated





 $E_h = \sum_{a=0}^3 \sum_{b=0}^3 \alpha_{h;a,b} \sigma_c^a \sigma_t^b$ Pauli twirling

 $\bar{\mathcal{N}}_{\Lambda} = F_{\Lambda}[\mathbb{1}] + \sum_{(a,b) \neq (0,0)} \epsilon_{a,b}[\sigma^a_{\rm c} \sigma^b_{\rm t}],$ 

Pauli twirling converts noise to stochastic form ➤ justification for ZNE

> Wallmann, Emerson; Li, Benjamin (2017)



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antum Error Correction and Applications in Condensed Matter Physics, USQIS School

#### Extending simulation time using pulse control and QEM



#### Postselection only



## See also the work by the IBM group

Article Published: 06 February 2023

Scalable error mitigation for noisy quantum circuits produces competitive expectation values

Youngseok Kim 🖂, Christopher J. Wood, Theodore J. Yoder, Seth T. Merkel, Jav M. Gambetta, Kristan Temme & Abhinav Kandala 🖂

Nature Physics 19, 752–759 (2023) Cite this article

#### Pulse and zero-noise extrapolation (ZNE) are effective strategies to reduce errors. But: ZNE is heuristic and cannot extend simulation time beyond coherence time of device.



## Scaled up simulations: approaching quantum utility regime

- Recent Nature publication from the IBM group: transverse-field Ising model dynamics simulations on 127 qubits
- Uses Zero-Noise Extrapolation (ZNE) informed by sparse Pauli noise tomography

#### Article Open Access Published: 14 June 2023

## Evidence for the utility of quantum computing before fault tolerance

Youngseok Kim , Andrew Eddins , Sajant Anand, Ken Xuan Wei, Ewout van den Berg, Sami Rosenblatt, Hasan Nayfeh, Yantao Wu, Michael Zaletel, Kristan Temme & Abhinav Kandala

Nature 618, 500–505 (2023) Cite this article

88k Accesses | 6 Citations | 631 Altmetric | Metrics

Hamiltonian

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

Initial state  $|\psi(t=0)
angle = |0
angle^{\otimes 127}$ 

- Stimulated several classical simulation works, e.g. Tindall et al., arXiv:2306.14887; Begusic, Chan, arXiv:2306.16372.
- Demonstration of fruitful interplay of quantum and classical simulations



#### **Trotter dynamics of 127 qubit transverse-field Ising model**





- Trotter circuit contains
   three layers
- Pauli twirling transforms the noise to Pauli noise
- Efficient noise tomography using a sparse Pauli noise model ansatz
- Can precisely tune the noise for ZNE since noise is well characterized (probabilistic noise amplification)



#### Trotter dynamics of 127 qubit transverse-field Ising model



**Fig. 2** | **Zero-noise extrapolation with probabilistic error amplification.** Mitigated expectation values from Trotter circuits at the Clifford condition  $\theta_h = 0$ . **a**, Convergence of unmitigated (G = 1), noise-amplified (G > 1) and noisemitigated (ZNE) estimates of  $\langle Z_{106} \rangle$  after four Trotter steps. In all panels, error bars indicate 68% confidence intervals obtained by means of percentile bootstrap. Exponential extrapolation (exp, dark blue) tends to outperform linear extrapolation (linear, light blue) when differences between the converged estimates of  $\langle Z_{106} \rangle_{G\neq0}$  are well resolved. **b**, Magnetization (large markers) is computed as the mean of the individual estimates of  $\langle Z_q \rangle$  for all qubits (small markers). **c**, As circuit depth is increased, unmitigated estimates of  $M_2$  decay monotonically from the ideal value of 1. ZNE greatly improves the estimates even after 20 Trotter steps (see Supplementary Information II for ZNE details).



#### **Classically verifiable regime**





Upper insets in all panels illustrate causal light cones, indicating in blue the final qubits measured (top) and the nominal set of initial qubits that can



## **Classically "challenging" regime**



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#### **Variational Quantum Dynamics**





#### **Variational Quantum Dynamics**





#### Application: continuous quench in spin chain

• Linear quench of anisotropic XY chain in transverse magnetic field

$$\hat{\mathcal{H}} = -J \sum_{i=0}^{N-2} \left[ (1+\gamma) \hat{X}_i \hat{X}_{i+1} + (1-\gamma) \hat{Y}_i \hat{Y}_{i+1} \right] + h_z \sum_{i=0}^{N-1} \hat{Z}_i \text{ with } \gamma(t) = 1 - \frac{2t}{T}$$



- Follows exact solution during and after quench, shown for *N*=8
- Circuit depth saturates at 100 CNOTs << Trotter circuit depth [[10]]^4 CNOTs</li>
- Simulate system with gate depth independent of time t > can simulate to arbitrary times!



## **Summary of CMP applications part**

- Condensed Matter Physics provides a rich set of problems that are relevant for domain specialists in physics, chemistry, material science
- Problems are often tunable and thus ideal for benchmarking and tuning into the quantum advantage regime
- Promising directions:

## Thanks for your attention!

- Simulation of nonequilibrium quantum dynamics
  - Trotter product formula approach is conceptually simple: combined with quantum error mitigation this is good candidate to reach beyond classical regime soon (maybe already)
  - Multi-product formulas (2207.11268, 2212.14144)
  - Variational methods can in principle extend simulation time further out, but suffer from measurement overhead and difficult classical optimization task
- Subspace expansion methods avoid classical optimization and are closer in spirit to ED: not covered here, but promising approach both for ground state and dynamics simulations
- Finite temperature simulations in d > 1: hard classically, so worth trying QC approaches

