Quantum computing for HEP: Digital twins for quantum states, some goals, and qudits

**Christine Muschik** 





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Let's see what your near future holds...



### **Overview**

- 1. Digital twins for quantum states
- 2. Some QuantHEP goals
- 3. Qudits for the win

#### Neural shadow quantum state tomography

Towards digital twins for quantum states



Phys. Rev. Research 6, 023250 (2024).

#### Neural shadow quantum state tomography

Victor Wei, W. A. Coish, Pooya Ronagh, Christine A. Muschik Phys. Rev. Research 6, 023250 (2024).





Victor Wei Stanford



Bill Coish McGill



Pooya Ronagh IQC, PI, UWaterloo



Christine Muschik IQC, PI, UWaterloo

#### **Digital twins of quantum states**





Some quantum states are hard to find...



...but easy to store classically.







Measure now

...decide later!



NISQ hardware



Post-process classically Clean up the state: error mitigation



NISQ hardware







Post-process classically Further optimization

#### **Combine quantum computing with traditional LGT calculations**



Finite density calculation, or time evolution



...regular lattice gauge theory computation.

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#### **Digital twins for quantum states**



Hybrid, etc... •

- POVMs, etc...

- Other models... •

#### Neural network quantum state tomography

Giacomo Torlai, Guglielmo Mazzola, Juan Carrasquilla, Matthias Troyer, Roger Melko & Giuseppe Carleo 🖂

Nature Physics 14, 447-450 (2018)



#### Neural network quantum state tomography



### Neural quantum state

Transformer neural network quantum state ansatz  

$$\begin{array}{c} & \downarrow \\ & \downarrow \\ & \psi_{\lambda}(s) = \sqrt{p_{\lambda_1}(s)}e^{i\varphi_{\lambda_2}(s)} \end{array} \end{array}$$
Takes a bit-string  $s = (s_1, s_2, \ldots, s_n) \in \{0, 1\}^n$ 

Parametrised by  $\lambda = (\lambda_1, \lambda_2)$ 

### Neural quantum state

\_\_\_\_

Measured bit-string *s* (corresponding to  $|s\rangle$ )

$$\psi_{\lambda}(s) = \sqrt{p_{\lambda_1}(s)} e^{i\varphi_{\lambda_2}(s)}$$

Complex-valued amplitude  $\langle s | \psi_{\lambda} \rangle$ 

Pure state ansatz!

#### Neural network quantum state tomography



Minimize: cross-entropy loss function

$$L_{\lambda} = -\frac{1}{|\mathcal{B}|} \sum_{B \in \mathcal{B}} \sum_{s \in \{0,1\}^n} p_{\Phi}(s,B) \ln p_{\psi_{\lambda}}(s,B).$$

#### Neural shadow quantum state tomography: NSQST



Classical shadows:

S. Aaronson, Shadow tomography of quantum states, in Proceedings of the 50th annual ACM SIGACT symposium on theory of computing (2018) pp. 325–338. H.-Y. Huang, R. Kueng, and J. Preskill, Predicting many properties of a quantum system from very few measurements, Nature Physics **16**, 1050 (2020).

#### Neural shadow quantum state tomography: NSQST





 $\psi_{\lambda}(s) = \sqrt{p_{\lambda_1}(s)} e^{i\varphi_{\lambda_2}(s)}$ 

Use classical shadows
 New cost function: fidelity

- 1. Improved phase information
- 2. Noise robustness

#### Neural shadow quantum state tomography: NSQST

- Perform random Clifford tails  $U_i$  and measure bit strings  $|b_i\rangle$ .
- Collect stabilizer states:  $|\phi_i\rangle = U_i^{\dagger}|b_i\rangle$ .
- Average effect of the Clifford twirling is a depolarizing noise channel  $\mathcal{M}$  with strength  $(2^n + 1)^{-1}$ .
- Classical shadows:  $\rho_i = \mathcal{M}^{-1}(|\phi_i\rangle\langle\phi_i|).$
- Target state:  $|\Phi\rangle\langle\Phi| = \mathbb{E}[\mathcal{M}^{-1}(|\phi_i\rangle\langle\phi_i|)].$
- New loss:

$$1 - |\langle \psi_{\lambda} | \Phi \rangle| \approx 1 - \frac{1}{N} \sum_{i}^{N} Tr(O_{\lambda} \rho_{i}) = 1 - \frac{1}{2^{n}} \left( 1 - \frac{1}{f} \right) - \frac{1}{N} \sum_{i}^{N} |\langle \phi_{i} | \psi_{\lambda} \rangle|^{2}$$



#### **NSQST** for concrete examples

1D-QCD: time-evolved state

Heisenberg antiferromagnet

Phase shifted GHZ state

#### **NSQST** for a concrete example



Simulating one-dimensional quantum chromodynamics on a quantum computer: Real-time evolutions of tetra- and pentaquarks

Yasar Y. Atas<sup>\*</sup>,<sup>1, 2</sup>,<sup>†</sup> Jan F. Haase<sup>\*</sup>,<sup>1, 2, 3</sup>,<sup>‡</sup> Jinglei Zhang,<sup>1, 2</sup>,<sup>§</sup> Victor Wei,<sup>1, 4</sup> Sieglinde M.-L. Pfaendler,<sup>5</sup> Randy Lewis,<sup>6</sup> and Christine A. Muschik<sup>1, 2, 7</sup>

#### **NSQST** for a 1D-QCD time evolution



Infidelity

### **NSQST** with pre-training



#### **NSQST** for a 1D-QCD time evolution



#### **NSQST:** Robustness to noise

Phys. Rev. Research 6, 023250 (2024).

## Outlook



#### Food for thought

Quantum experiments are difficult to perform:

- Expensive
- Time-intensive

No-cloning theorem:

- How to capture experiments in a re-usable fashion
- Make the results of an experiment available to the community

Neural network trained on quantum data:

- Schemes like NSQST can be more useful than a list of measurements
- in the same way GPT is more useful than a text on the web

The neural network representation is a digital twin of the quantum state

- Shift the value from quantum experiments to quantum data
- Inference from the digital twin us cheaper than re-running quantum experiments
- The digital town is more malleable and easier to interface with than a quantum computer

#### **Combine quantum computing with traditional LGT calculations**



Finite density calculation, or time evolution



...regular lattice gauge theory computation.

#### Hamiltonian learning



Time evolution

Local measurements on time-evolved state

Matrix Product States

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### Some goals

 $Past \rightarrow Present \rightarrow Future$ 

#### Real-time dynamics of lattice gauge theories with a fewqubit quantum computer

Nature 534, 516-519 (2016)

Quantum simulation of 1D-QED



#### **Theory + Experiment**



## Top 10 breakthroughs in physics 2016

Physics World



#### nature

#### COMPUTING

## In a First, Quantum Computer Simulates High-Energy Physics

The technique could allow quantum computers to address otherwise-intractable problems in particle physics

### Some goals





#### Gauge group of QCD



Loop-String-Hadron Formulation for SU(2) and SU(3): Indrakshi Raychowdhury, Jesse Stryker General quantum algorithms for non-Abelian LGTs: Zohreh Davoudi, Alexander F. Shaw, Jesse R. Stryker Trailhead for SU(3): Anthony Ciavarella, Natalie Klco, Martin J. Savage Digitizing SU(2) Gauge Fields: T. Hartung, T. Jakobs, K. Jansen, J. Ostmeyer, C. Urbach 3 new quantum simulation ideas for non-Abelian gauge theories: Torsten Zache, Daniel González-Cuadra, Peter Zoller

#### Simulating 1D-QCD on a quantum computer

#### **Theory + Experiment:**

- Tetraquarks
- Real-time evolution

Simulate quarks with three colours, i.e. the gauge group of QCD



#### Simulating 1D-QCD on a quantum computer

#### **Related work:**

#### Preparations for Quantum Simulations of Quantum Chromodynamics in 1+1 Dimensions: (I) Axial Gauge

#### Roland C. Farrell, Ivan A. Chernyshev, Sarah J. M. Powell, Nikita A. Zemlevskiy, Marc Illa, Martin J. Savage

Tools necessary for quantum simulations of 1 + 1 dimensional quantum chromodynamics are developed. When formulated in axial gauge and with two flavors of quarks, this system requires 12 qubits per spatial site with the gauge fields included via non-local interactions. Classical computations and D-Wave's quantum annealer Advantage are used to determine the hadronic spectrum, enabling a decomposition of the masses and a study of quark entanglement. Color edge states confined within a screening length of the end of the lattice are found. IBM's 7-qubit quantum computers, ibmq\_jakarta and ibm\_perth, are used to compute dynamics from the trivial vacuum in one-flavor QCD with one spatial site. More generally, the Hamiltonian and quantum circuits for time evolution of 1 + 1 dimensional  $SU(N_c)$  gauge theory with  $N_f$  flavors of quarks are developed, and the resource requirements for large-scale quantum simulations are estimated.



M. Savage, University of Washington

#### Experimental demonstration of color neutral objects (gauge singlets/color singlets).

Color neutral states of SU(3): invariant under arbitrary rotations in color space

Involve all the color charges available in the theory i.e. red, green, and blue (and their anticolors). In contrast to Abelian quantum electrodynamics (QED), where a singlet state involves electron-positron pairs only.

Color singlet states are the relevant physical states,

 $\rightarrow$  important step towards the understanding, description and prediction of more complex and realistic experiments



### Some goals



#### Some goals



## Gauge theories for particle physics beyond 1D



#### **Experimental demonstrations**

#### Gauge theories for particle physics beyond 1D

- N. Klco, M. J. Savage, and J. R. Stryker, Phys. Rev. D 101, 074512 (2020).
- A. Ciavarella, N. Klco, and M. J. Savage, Phys. Rev. D **103**, 094501 (2021).
- S. A Rahman, R. Lewis, E. Mendicelli, and S. Powell, Phys. Rev. D **104**, 034501 (2021).
- A. N. Ciavarella and I. A. Chernyshev, Phys. Rev. D 105, 074504 (2022).
- S. A Rahman, R. Lewis, E. Mendicelli, and S. Powell, Phys. Rev. D **106**, 074502 (2022).
- S. A. Rahman, R. Lewis, E. Mendicelli, and S. Powell, "Real time evolution and a traveling excitation in SU(2) pure gauge theory on a quantum computer," (2022), arXiv:2210.11606 [hep-lat].
- A. N. Ciavarella, "Quantum Simulation of Lattice QCD with Improved Hamiltonians," (2023), arXiv:2307.05593 [hep-lat].



#### **Impressive Advances!**

(so far gauge fields or matter fields were trivial)

#### **Experimental demonstration**

Gauge theories for particle physics beyond 1D



Including both - dynamical gauge and matter fields

#### Some goals



**Representing the gauge fields** 



## Gauge fields

#### Truncations for bosonic systems:

- Schwinger boson representation
- Holstein-Primakoff-representation
- Dysen-Maleev transformation
- Highly occupied boson model

#### Truncations for qubit systems:

$$\begin{array}{ccc} \hat{E} \longmapsto \hat{S}^{z}, \\ \hat{U} \longmapsto \hat{V}^{-}, \end{array} & \hat{v}^{-} \equiv \begin{bmatrix} 0 & \dots & 0 \\ 1 & \dots & 0 \\ 0 & \ddots & \vdots & 0 \\ 0 & \dots & 1 & 0 \end{bmatrix} \end{array} \begin{array}{c} \text{Alternative:} \\ \hat{V}^{-} \equiv \hat{S}^{-}/|l| \\ \hat{S}^{-} = \hat{S}^{\mathbf{x}} - i\hat{S}^{y} \end{array}$$



#### **Gauge fields**

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## Hilbert space truncation with a regularisation of the gauge group



(\*) Our scheme was further improved in: C. W. Bauer and D. M. Grabowska, Phys. Rev. D 107, L031503 (2023).

## Hilbert space truncation with a regularisation of the gauge group

	$1/g^2$	Standard truncation (electric basis)	Scaled $\mathbb{Z}_N$ truncation (electric and magnetic basis)	
electric fields dominate	0.1	27	27	-
intermediate regime	10	2197	125	
magnetic fields dominate	100	> 9261	27	

g = bare coupling

Number of states required to reach a 1% accuracy in the expectation value of the two-dimensional plaquette in QED

#### Some goals



#### Some goals



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# Beyond binary

Today's quantum hardware: capable of qudit encoding

- Trapped ions
- Superconducting architectures
- Rydberg atoms in optical tweezers
- Ultracold atoms in optical lattices
- Nuclear spins
- Photonic systems



**Gauge fields represented by qudits** 



[Reference to Martin's paper]









## **Qudits for Quantum Technology**

#### **Positions available (Masters/PhD/Postdoc)**

www.quantum-interactions.com



















## Thank you for your time



Represent gauge fields

Introduced "B-rep" Quantum 5, 393 (2021).

Developed qudit algorithms



Non-Abelian 1D-SU(2) Experiment on IBM 1D-SU(3) Experiment on IBM