

Lectures 1-4: Theoretical Quantum Optics

Part I: Hamiltonian engineering & quantum optical toolbox

Part II: quantum noise & open quantum systems

... basic concepts & minimal models

... how we "think" about quantum noise in quantum optics

Seminar: Programmable Quantum Simulators with Atoms and Ions

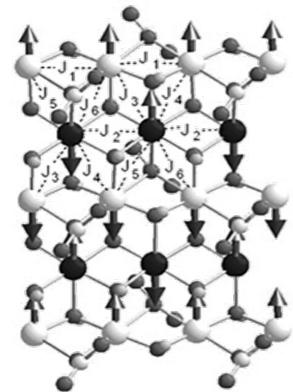
Programmable Analog Quantum Simulators



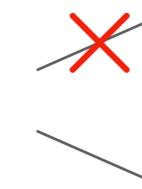
Peter Zoller

Quantum Simulation

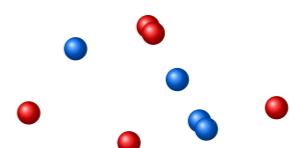
Problem: 'solving' a quantum many-body problem



$$\hat{H} = \sum_{i,j} \left[J_1 \hat{S}_i^z \hat{S}_j^z + J_2 \left(\hat{S}_i^+ \hat{S}_j^- + \hat{S}_i^- \hat{S}_j^+ \right) \right]$$



Classical
Computing

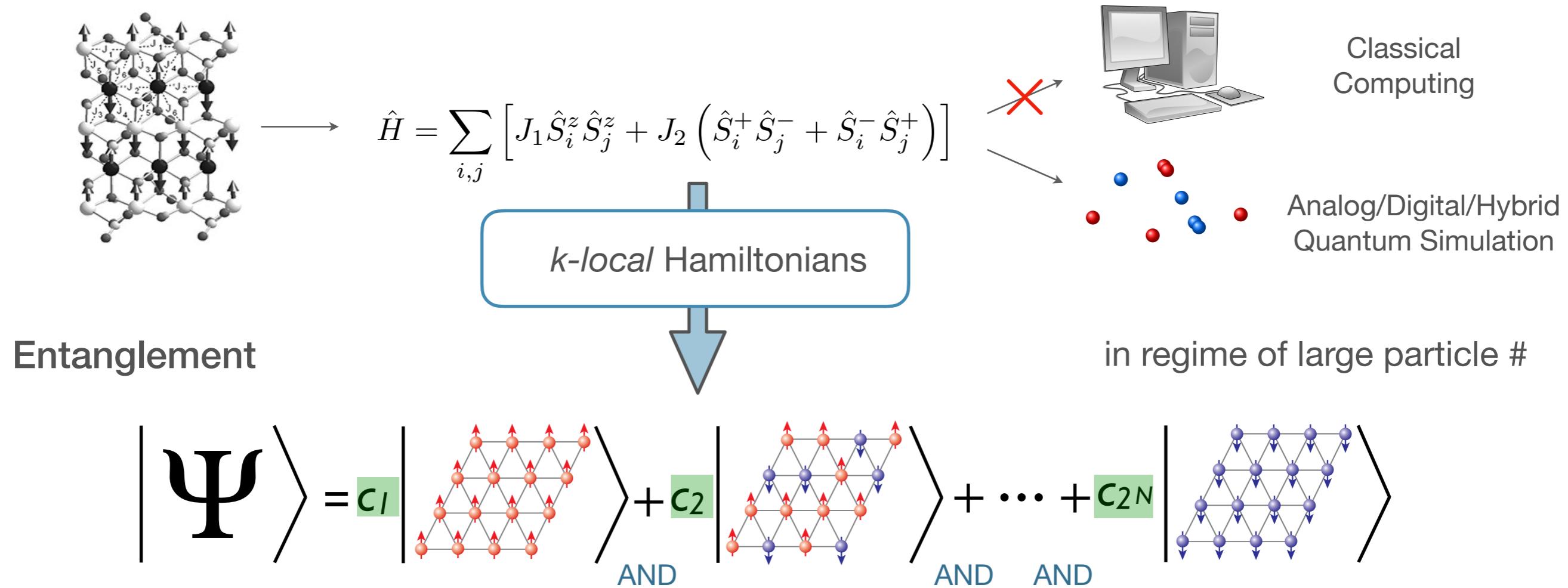


Analog/Digital/Hybrid
Quantum Simulation

'quantum advantage'

Frontier of large-scale entanglement / large-particle number

Problem: 'solving' a quantum many-body problem



Goal/Challenge: Learn large-scale entanglement structure of many-body quantum state

Outline:

Introduction & Background Material

- Programmable Quantum Simulators - Atomic Platforms
- Characterizing Entanglement in Many-Body Systems

How to measure Entanglement

- Randomized Measurement Toolbox
- Renyi Entanglement Entropy
- ...

A Elben, ST Flammia, HY Huang, R Kueng, J Preskill,
B Vermersch & PZ, Nature Review Physics (2022)

10, 20 ... 50 Qubit Trapped-Ion Programmable Quantum Simulator @ IQOQI-Labs

Transverse long-range Ising model

... and single site
control & readout

focused
laser

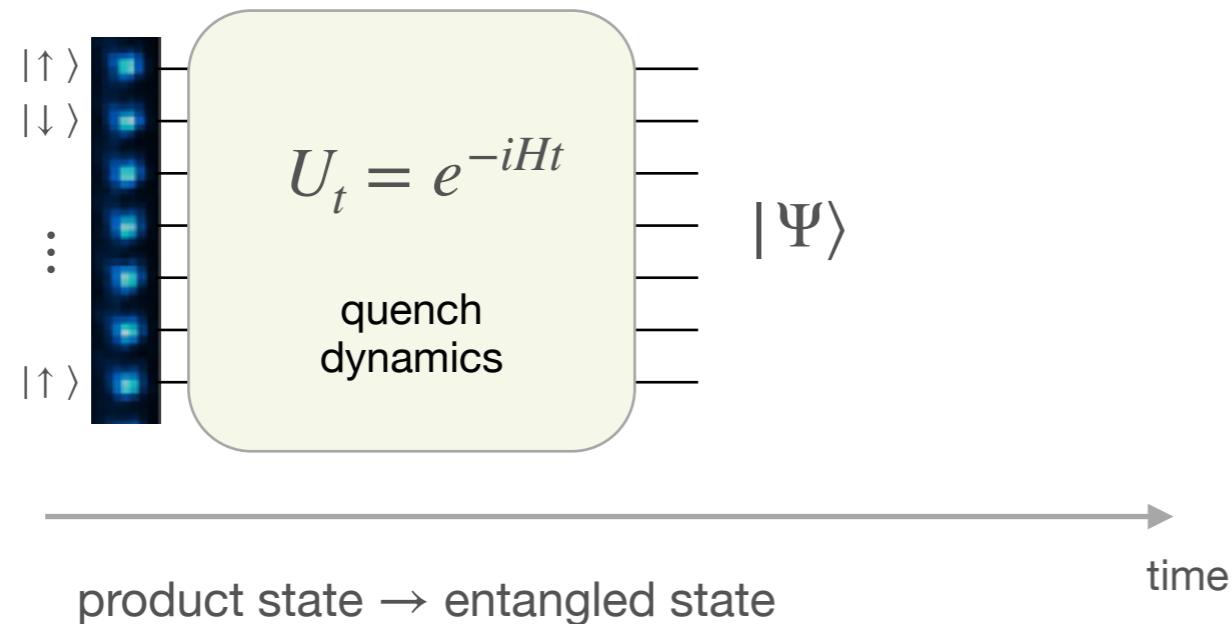
Innsbruck, Duke, Rice ...

$$\hat{H}_{\text{Ising}} = \sum_{i,j} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x + B \sum_i \hat{\sigma}_i^z$$

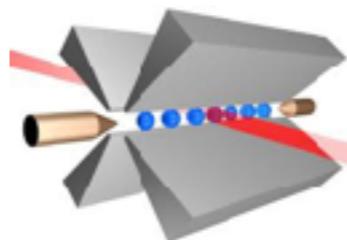
C. Monroe et al., *Programmable quantum simulations of spin systems with trapped ions*. RMP (2021)

Analog Quantum Simulators

What physics can we do ... ?

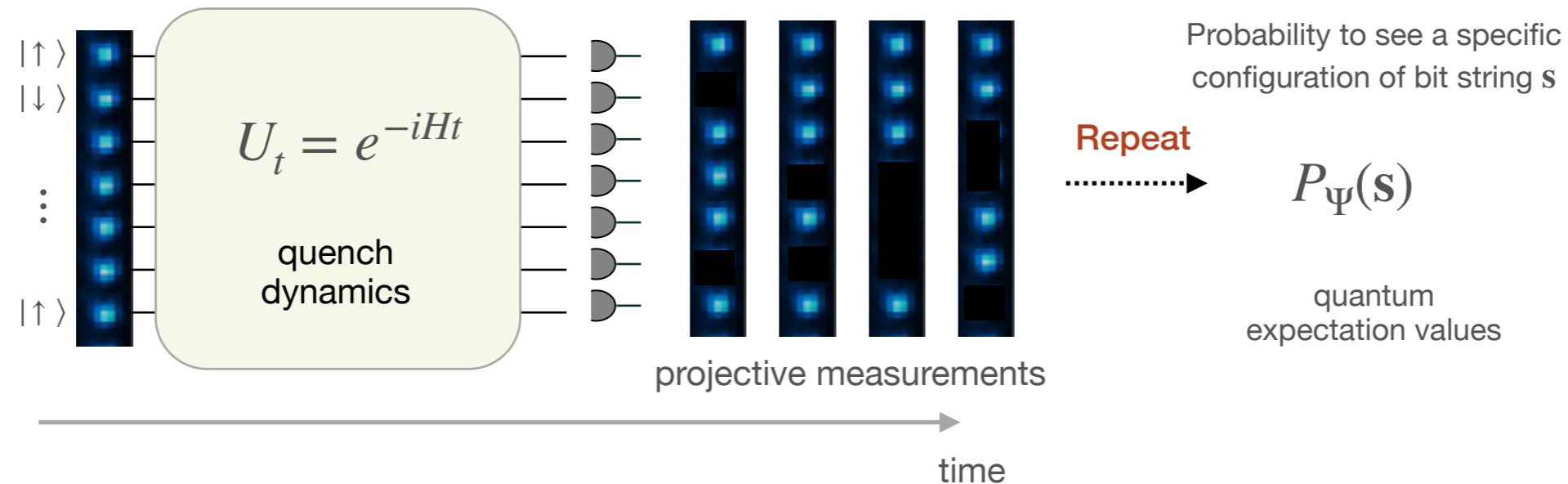


$$\hat{H}_{\text{Ising}} = \sum_{i,j} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x + B \sum_i \hat{\sigma}_i^z$$



Analog Quantum Simulators

What physics can we do ... ?

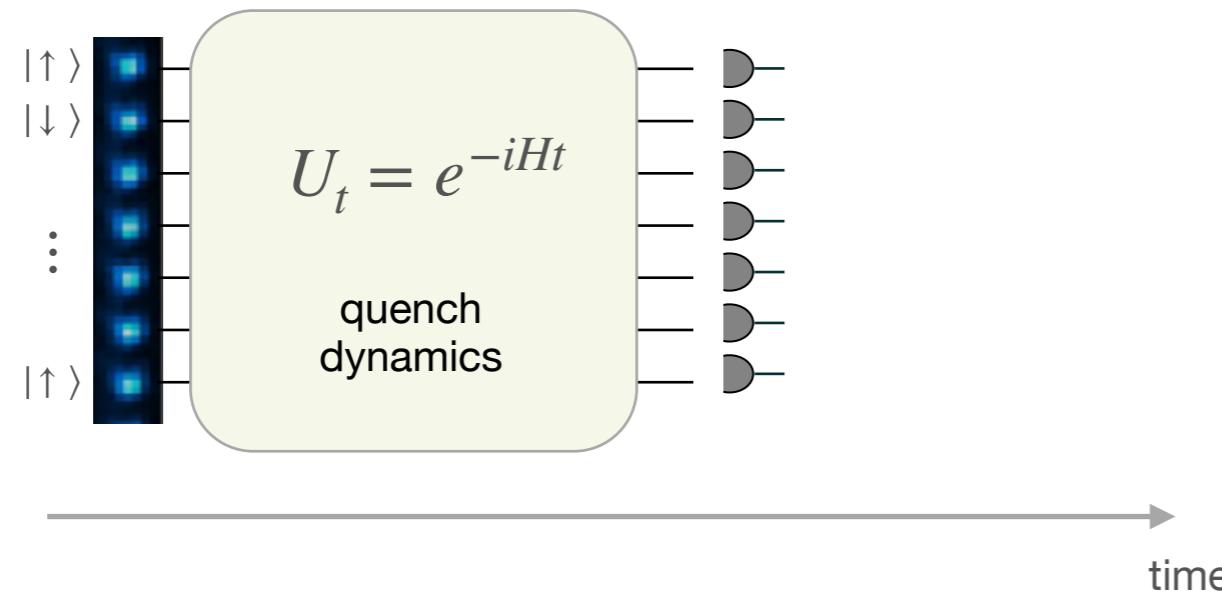


Native Hamiltonian

$$\hat{H}_{\text{Ising}} = \sum_{i,j} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x + B \sum_i \hat{\sigma}_i^z$$

Analog Quantum Simulators

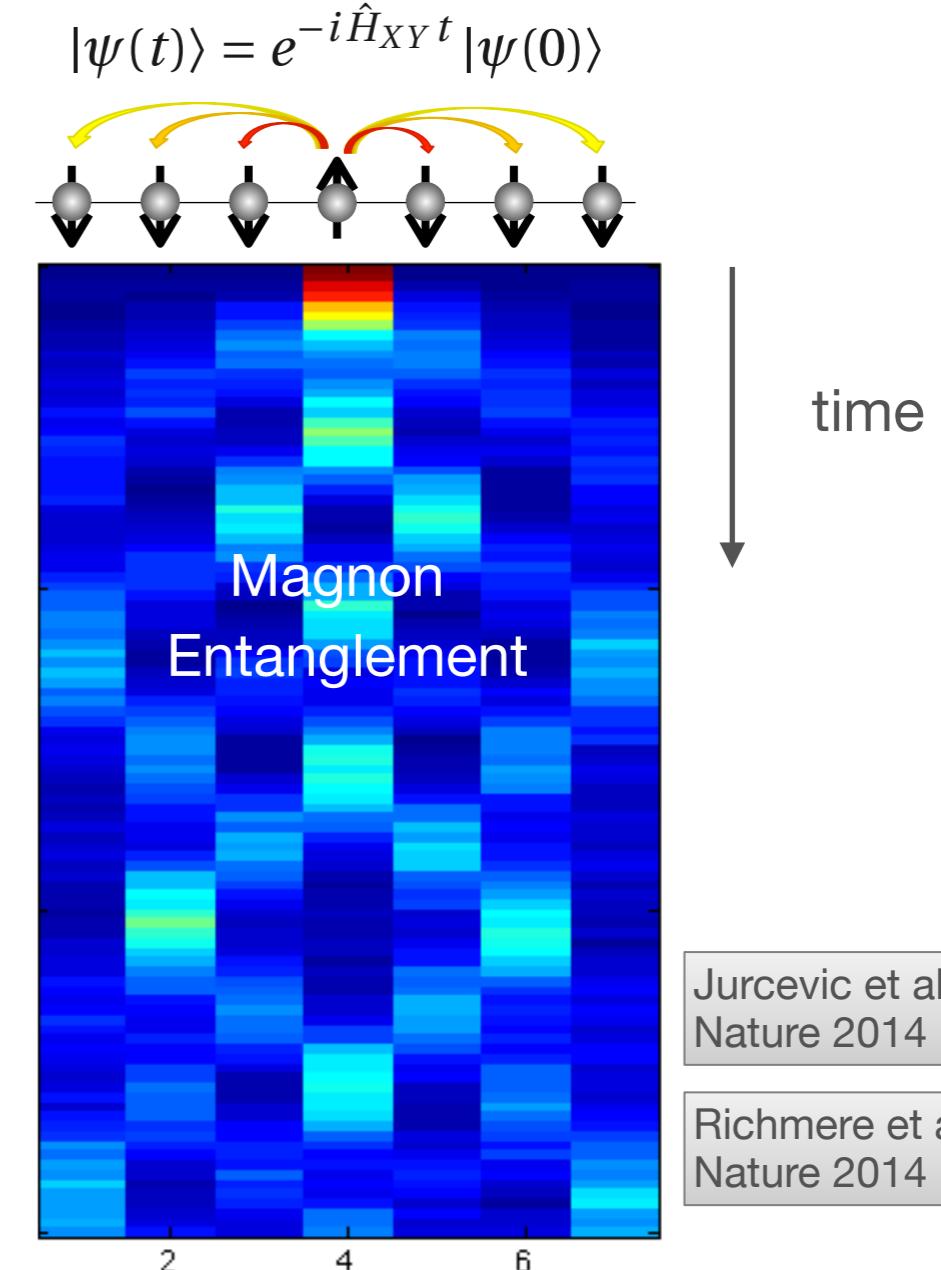
What physics can we do ... ?



Native Hamiltonian

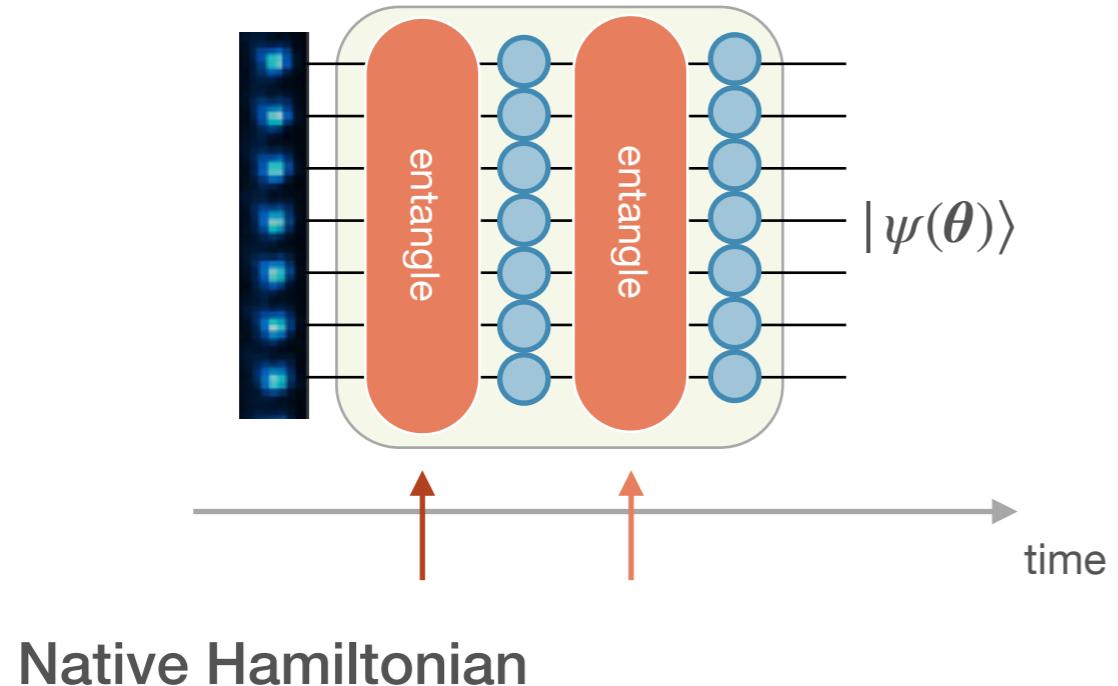
$$\hat{H}_{\text{Ising}} = \sum_{i,j} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x + B \sum_i \hat{\sigma}_i^z$$

Entanglement in quench dynamics



'Programming' Quantum Simulators

programming entangled states



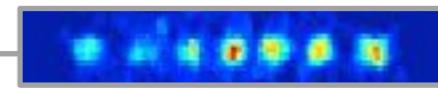
Native Hamiltonian

$$\hat{H}_{\text{Ising}} = \sum_{i,j} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x + B \sum_i \hat{\sigma}_i^z$$

... as resource for high-fidelity N-body gate

family of entangled states

$$|\psi(\theta)\rangle = \hat{U}_N(\theta_N) \dots \hat{U}_2(\theta_2) \hat{U}_1(\theta_1) |\psi_0\rangle$$



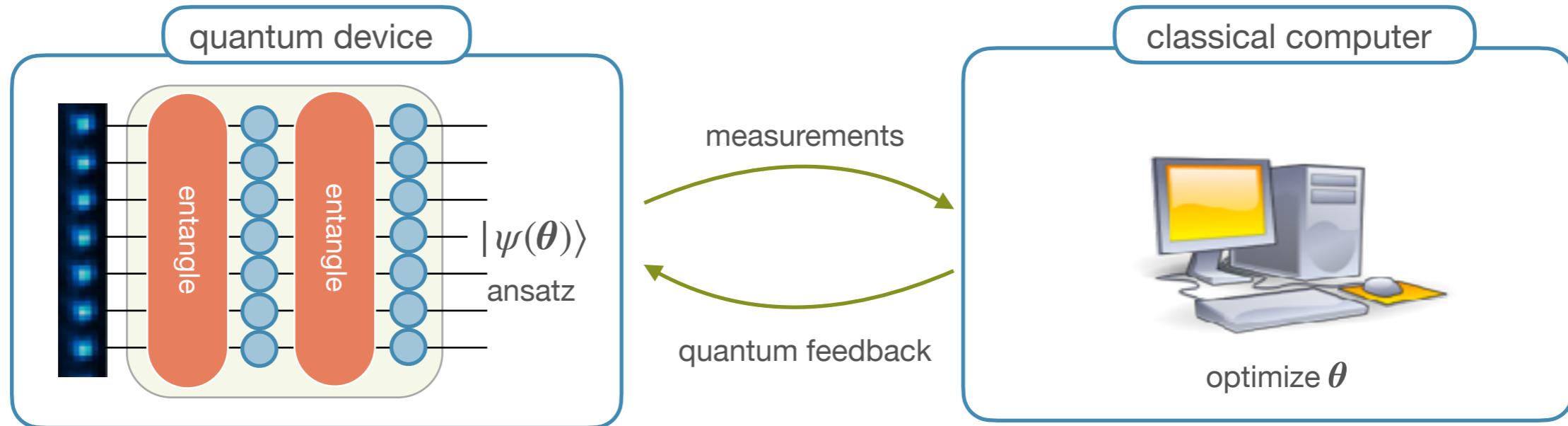
trapped ion quantum resources

$$\hat{U}_1(\theta) = e^{-i\theta \sum_{ij} J_{ij} \hat{\sigma}_i^x \hat{\sigma}_j^x}$$
 entangle (Ising)

$$\hat{U}_{2,i}(\theta) = e^{-i\theta \mathbf{n} \cdot \hat{\sigma}_i}$$
 local rotations

- in general not universal gate set
- scalable

'Programming' Quantum Simulators



Variational Classical-Quantum Algorithms

target Hamiltonian (e.g. lattice model)

$$\hat{H}_T = \sum_{n\alpha} h_n^\alpha \hat{\sigma}_n^\alpha + \sum_{n\ell\alpha\beta} h_{n\ell}^{\alpha\beta} \hat{\sigma}_n^\alpha \hat{\sigma}_\ell^\beta + \dots$$

Variational Quantum Eigensolver (VQE)

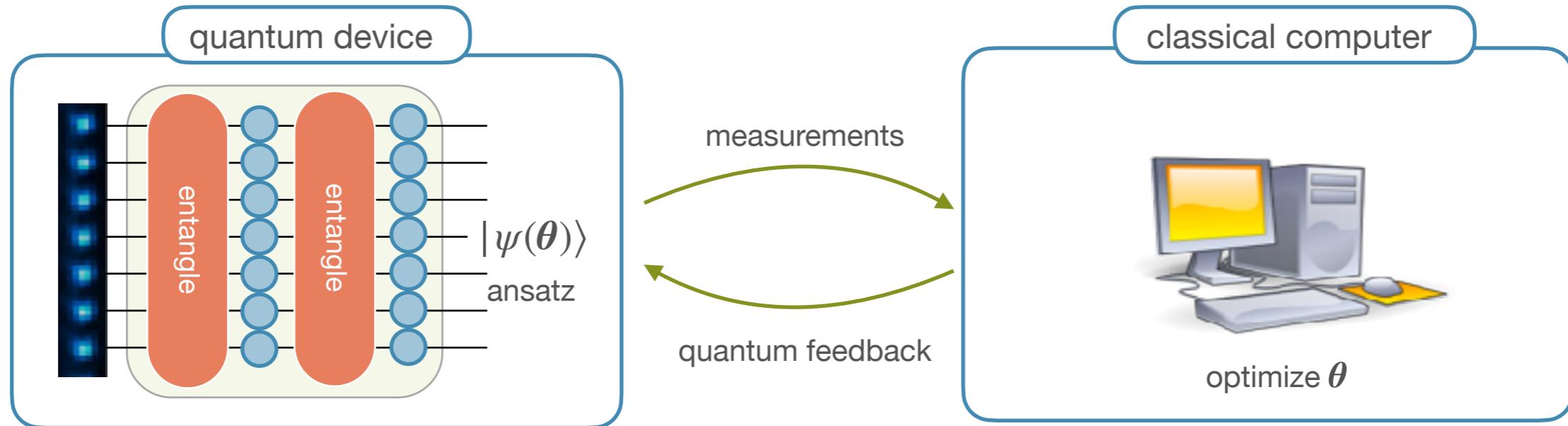
$$\text{Energy}(\theta) = \langle \psi(\theta) | \hat{H}_T | \psi(\theta) \rangle \rightarrow \min$$

... computing
ground states

QAOA, E Farhi, J Goldstone, S Gutman, arXiv:1411.4028,

Review: M Cerezo, A Arrasmith, R Babbush, SC Benjamin, S Endo, K Fujii, JR McClean, K Mitarai, X Yuan, L Cincio, PJ Coles, Nature Reviews Physics 3, 625 (2021)

'Programming' Quantum Simulators



Variational Classical-Quantum Algorithms

target Hamiltonian (e.g. lattice model)

$$\langle \hat{H}_T \rangle = \sum_{n\alpha} h_n^\alpha \langle \hat{\sigma}_n^\alpha \rangle + \sum_{n\ell\alpha\beta} h_{n\ell}^{\alpha\beta} \langle \hat{\sigma}_n^\alpha \hat{\sigma}_\ell^\beta \rangle + \dots$$

measured on quantum device

Variational Quantum Eigensolver (VQE)

$$\text{Energy}(\theta) = \langle \psi(\theta) | \hat{H}_T | \psi(\theta) \rangle \rightarrow \min$$

... computing
ground states

robust to design errors in resource Hamiltonians!

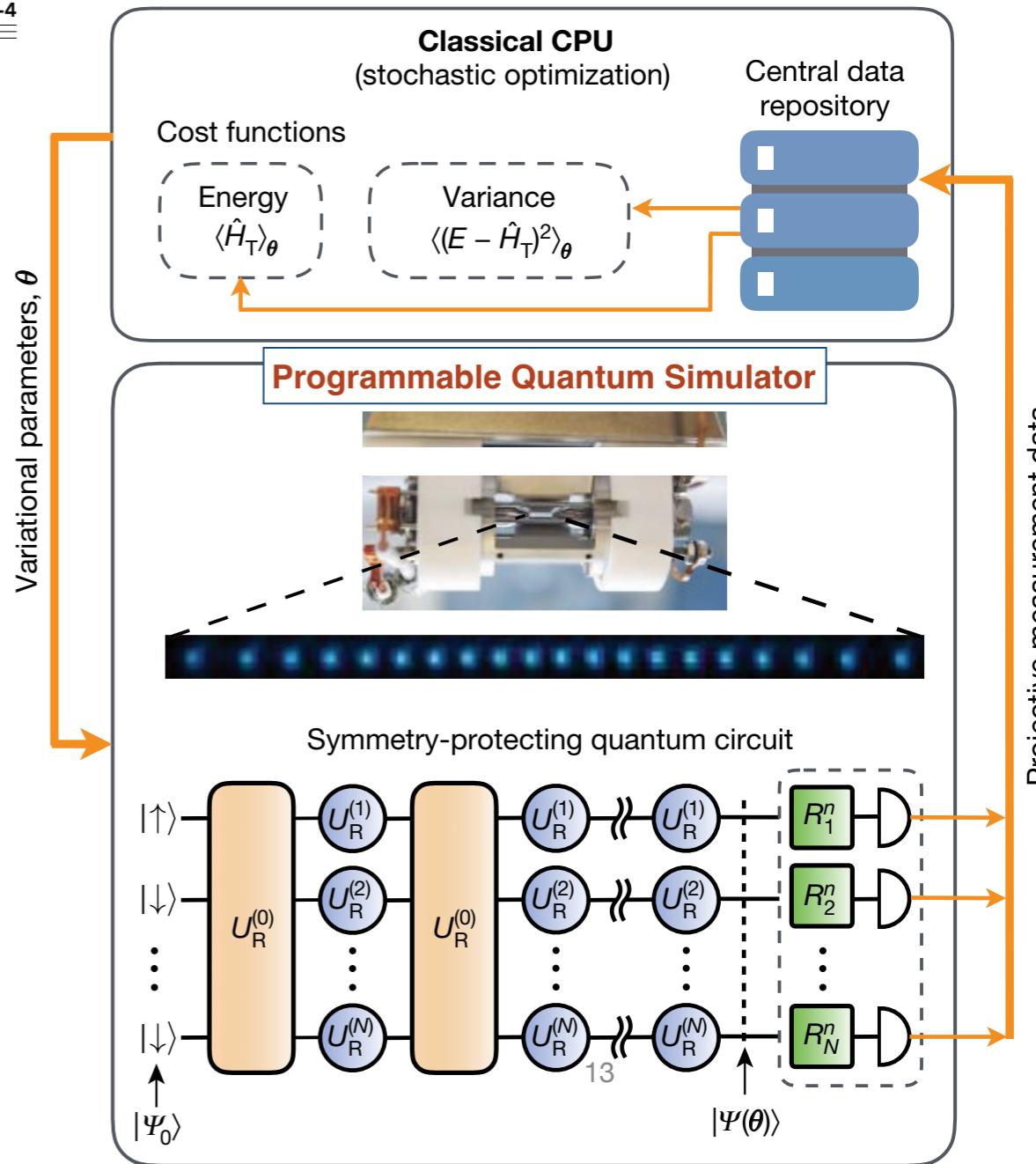
Self-verifying variational quantum simulation of lattice models

C. Kokail^{1,2,3}, C. Maier^{1,2,3}, R. van Bijnen^{1,2,3}, T. Brydges^{1,2}, M. K. Joshi^{1,2}, P. Jurcevic^{1,2}, C. A. Muschik^{1,2}, P. Silvi^{1,2}, R. Blatt^{1,2}, C. F. Roos^{1,2} & P. Zoller^{1,2*}



Rick van Bijnen (th-postdoc), Christine Maier (exp-PhD), Christian Kokail (th-PhD)

Classical - Quantum Feedback Loop

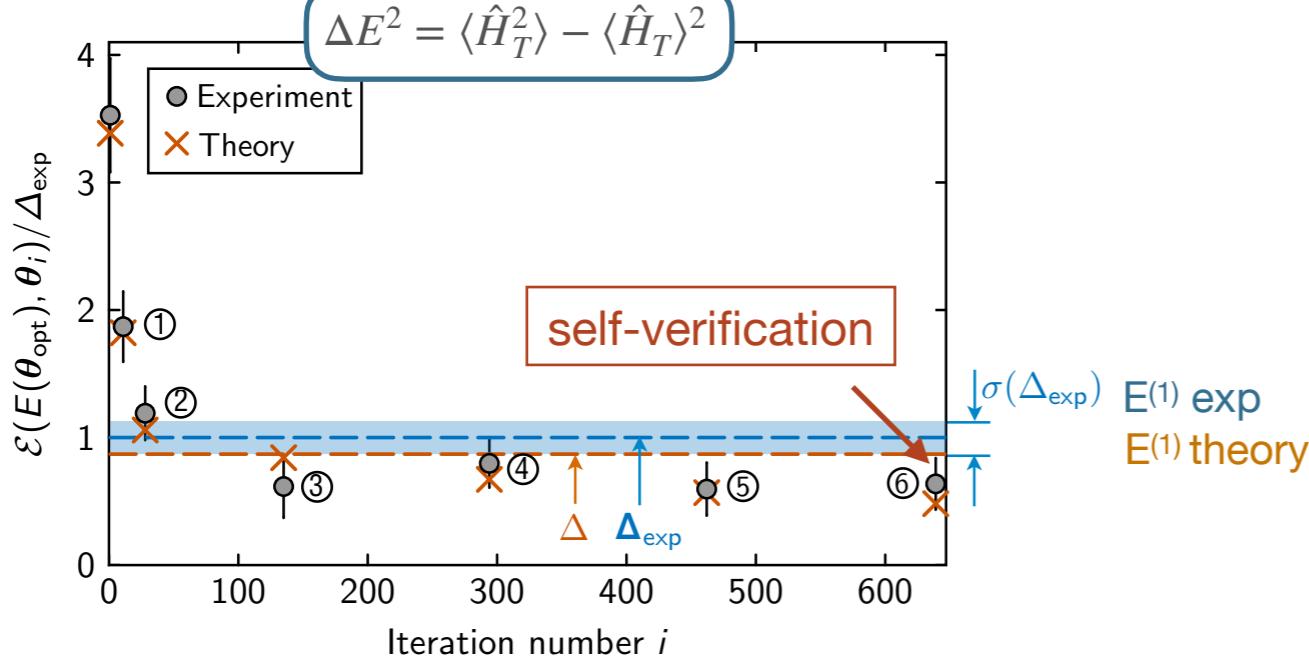
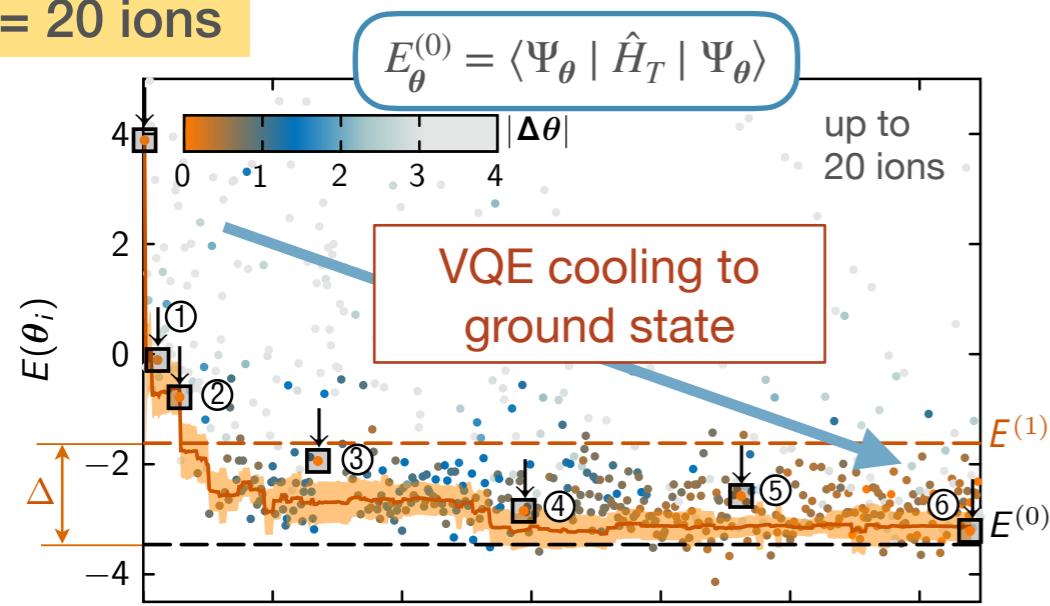


20 (now: 50) qubits, 10^5 call of PQS, circuit depth 6

Energy Optimization Trajectory for Ground State (VQE)



$N = 20$ ions



Quantum machine provides energy and error bar

Lattice Schwinger Model (1+1D QED)

$$H_T = J \sum c_{ij} \hat{\sigma}_i^z \hat{\sigma}_j^z$$

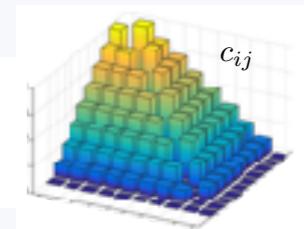
long - range interaction

$$+ w \sum (\hat{\sigma}_i^+ \hat{\sigma}_{i+1}^- + \hat{\sigma}_{i+1}^+ \hat{\sigma}_i^-)$$

particle - antiparticle creation/annihilation

$$+ m \sum c_i \hat{\sigma}_i^z + J \sum \tilde{c}_i \hat{\sigma}_i^z$$

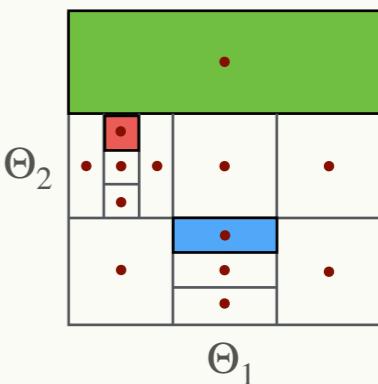
effective particle masses



Dividing RECTangles (DIRECT)

global optimization
in noisy landscape

- 15 parameters
- circuit depth = 6
- budget: 10^5 calls to simulator

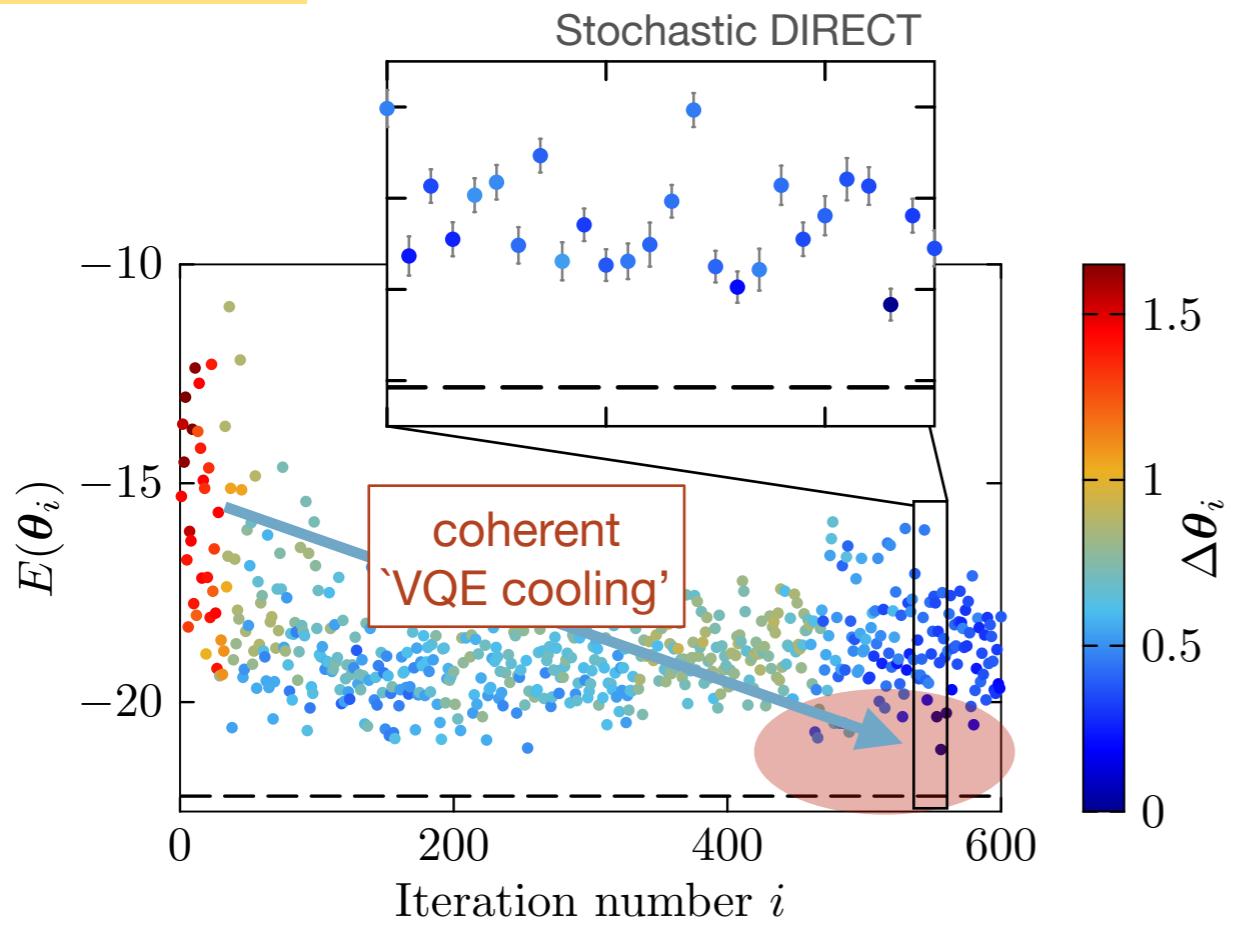


C Kokail, C Maier, R van Bijnen, T Brydges, MK Joshi, P Jurcevic,
CA Muschik, P Silvi, R Blatt, CF Roos & P.Z., Nature (2019)

Experimental Energy Optimization Trajectory for Ground State (VQE)

MJ Joshi, C Kokail, R van Bijnen,
F Kranzl, TV Zache, R Blatt, CF Roos, & PZ,
Nature online Nov 29 (2023)

N = 51 ions



prepare pure quantum state $|\Psi\rangle$
~ low 'temperature' $T \sim \text{few } J$

explore low energy physics

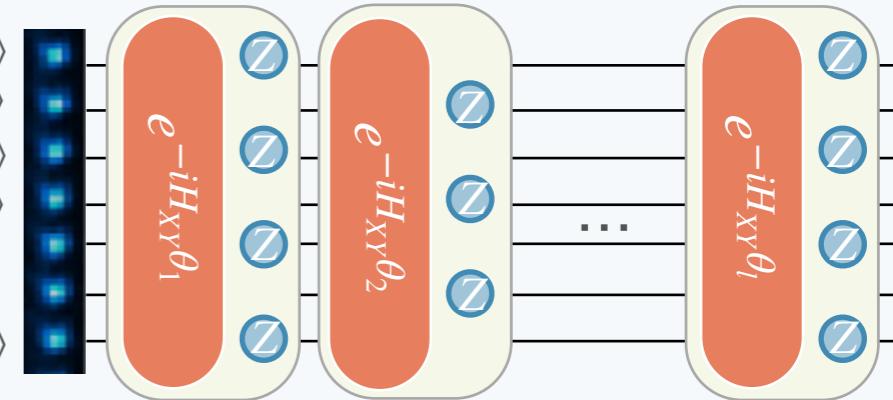
Target Model: XXZ (Heisenberg spin- $\frac{1}{2}$)

$$\hat{H}_T = J \sum_{i=1}^{N-1} \left(\hat{S}_i^x \hat{S}_{i+1}^x + \hat{S}_i^y \hat{S}_{i+1}^y \right) + \Delta \sum_{i=1}^{N-1} \hat{S}_i^z \hat{S}_{i+1}^z$$

$-J$ critical $+J$ gapped $J = \Delta = 1$

Short VQE Circuit with Ion Resources

N=31 or 51 ions



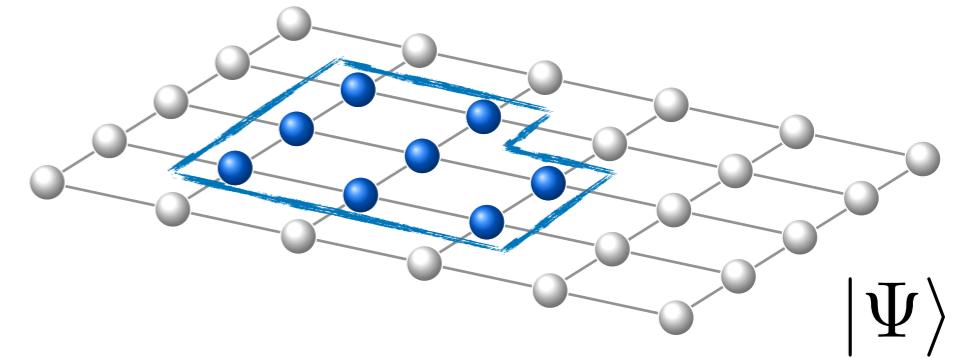
New Physics ...?

- Basic Quantum Science

‘Learning’ Entanglement

C. Kokail et al, Nat. Phys. 17, 936–942 (2021)

MK Joshi, C Kokail, R van Bijnen et al., Nature online Nov 28 (2023)

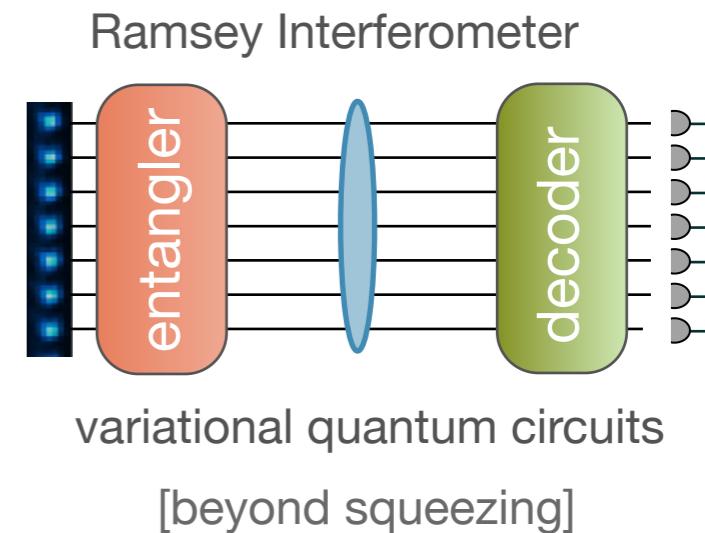


- Applications

Optimal Quantum Metrology

R. Kaubruegger et al., Phys. Rev. X. 11, 041045 (2021)

CD Marciniak et al., Nature. 603, 604 (2022).

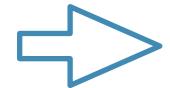


... enabled by Programmable Q-Simulator

Outline:

Introduction & Background Material

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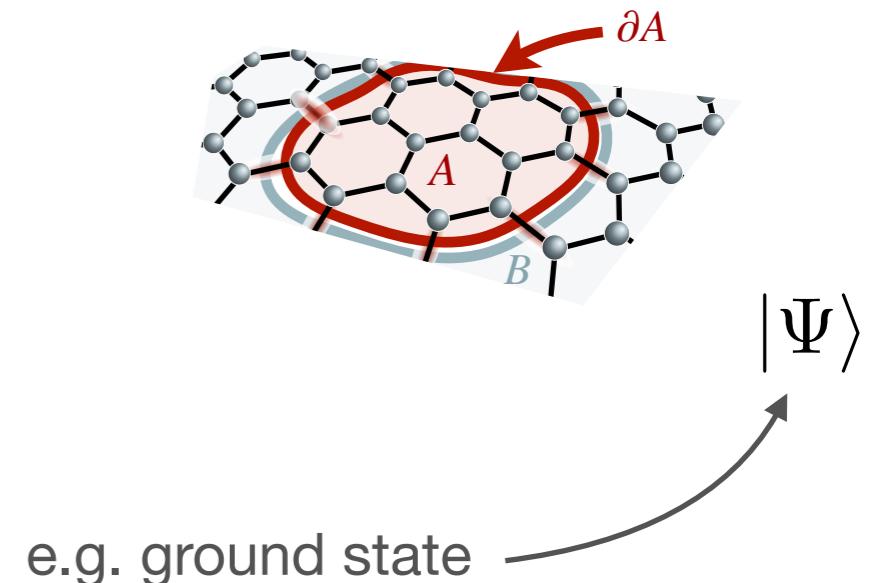


- Characterizing Entanglement in Many-Body Systems

Characterizing Entanglement in Quantum Many-Body System

Reduced density matrix

$$\rho_A = \text{Tr}_B [|\Psi\rangle\langle\Psi|]$$



e.g. ground state

Two systems are bipartite entangled iff $|\Psi\rangle \neq |\Psi\rangle_A \otimes |\Psi\rangle_B$

$$\text{Tr}_A[\rho_A^2] < 1 \quad \text{purity}$$

$$S_A^{\text{VN}} = -\text{Tr}_A[\rho_A \log \rho_A]$$

Von Neumann
entanglement entropy

How to measure?

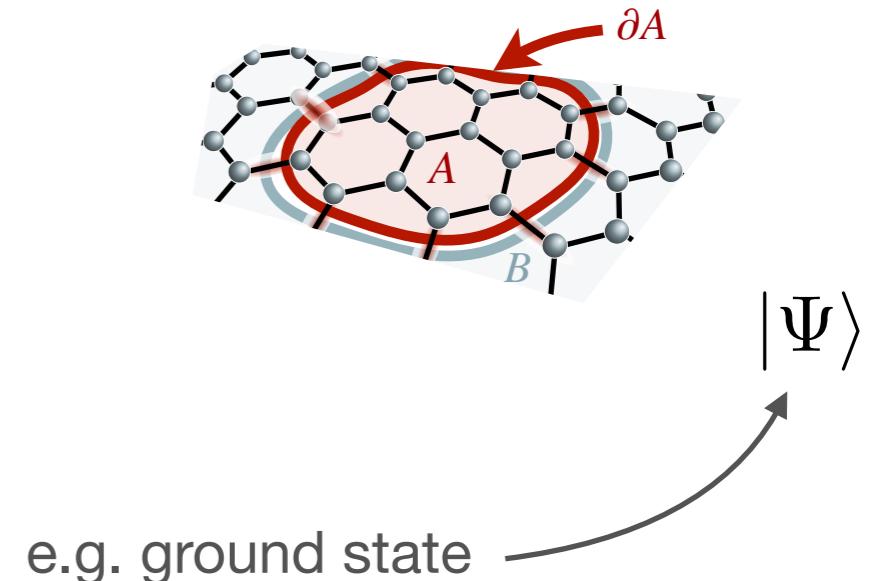
e.g. via randomized measurements

A Elben, ST Flammia, H-Y Huang, R Kueng, J Preskill, B Vermersch & PZ, arXiv:2203.11374

Characterizing Entanglement in Quantum Many-Body System

Reduced density matrix

$$\rho_A = \text{Tr}_B [|\Psi\rangle\langle\Psi|]$$



e.g. ground state

Two systems are bipartite entangled iff $|\Psi\rangle \neq |\Psi\rangle_A \otimes |\Psi\rangle_B$

$$|\Psi\rangle = \sum_{\alpha=1}^{\chi} e^{-\xi_{\alpha}/2} |\Phi_{\alpha}^A\rangle \otimes |\Phi_{\alpha}^B\rangle$$

$\chi = 1$ product state

$\chi > 1$ entangled state

ρ_A has rank χ

Schmidt decomposition

Reviews: L. Amico, R. Fazio, A. Osterloh and V. Vedral, RMP (2008); J. Eisert, M. Cramer and M. B. Plenio, RMP (2010); P. Calabrese, J. Cardy and B. Doyon, JPA (2009); I. Peschel and V. Eisler, JPA (2009); O. Guhne, and G. Tth, Phys. Rep. (2009); J. I Cirac, D Prez-Garca, N Schuch, and F Verstraete, RMP (2021)

Characterizing Entanglement in Quantum Many-Body System

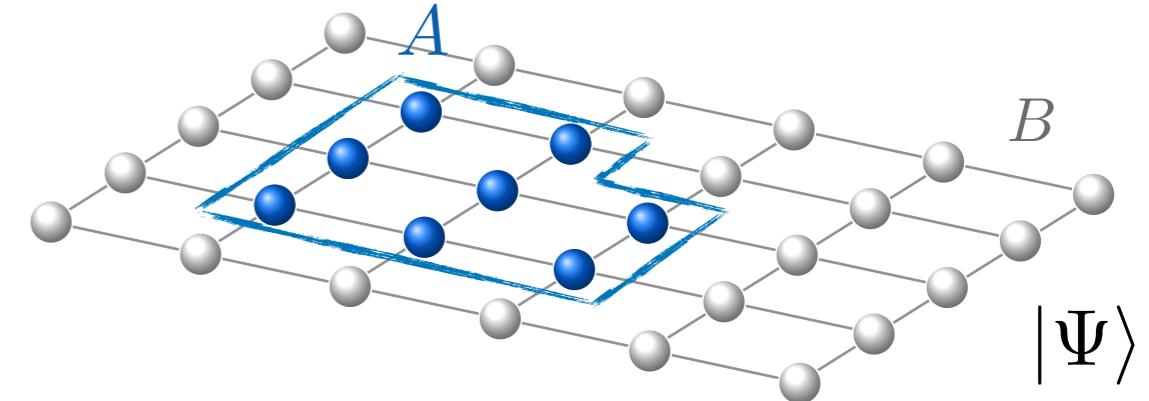
Reduced density matrix

$$\rho_A = \text{Tr}_B [|\Psi\rangle\langle\Psi|] = e^{-\tilde{H}_A}$$

mixed state: Gibbs ensemble with EH

$$= \sum_{\alpha=1}^{\chi} e^{-\xi_{\alpha}} |\Phi_{\alpha}^A\rangle\langle\Phi_{\alpha}^A|$$

entanglement spectrum



Why interesting?

- Entanglement measures
- fingerprint of topological order (Li-Haldane)
- detection of quantum phase transitions

... low-lying entanglement spectrum can be used as a “fingerprint” to identify topological order. [PRL 2008]

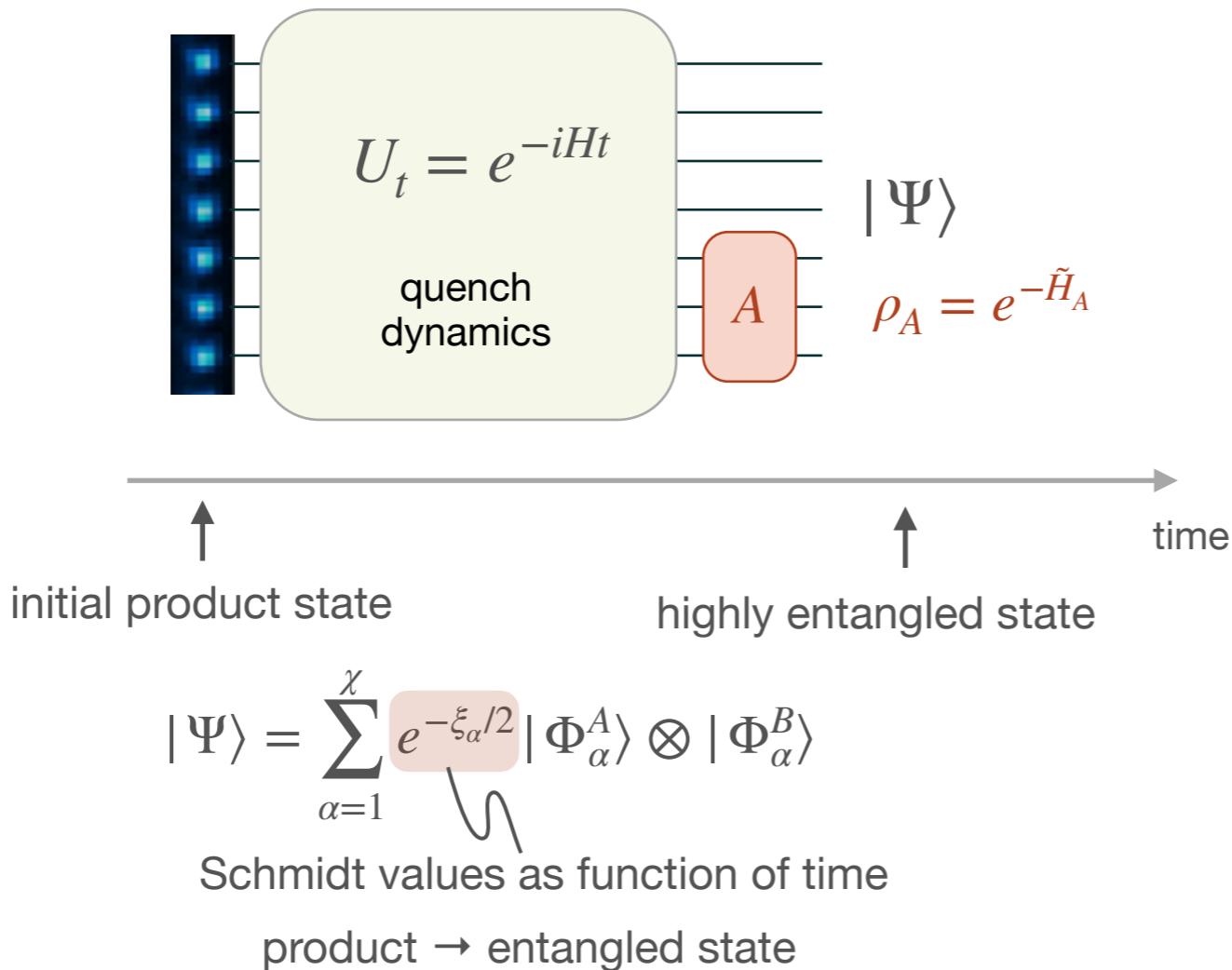


D. Haldane

Can we ‘learn’ operator structure of Entanglement Hamiltonian? (sample-)efficient?

Example: Entanglement Spectrum & Quench Dynamics

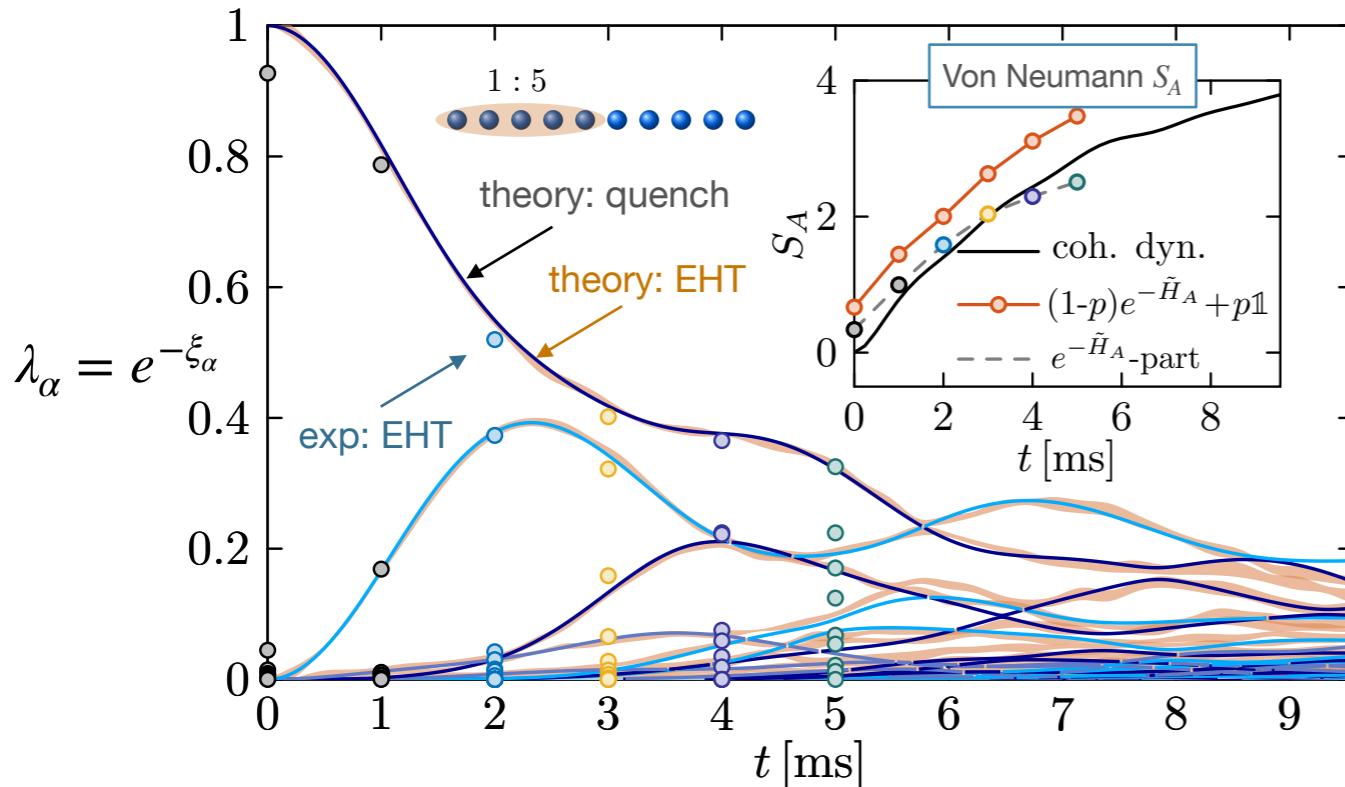
Quench dynamics with analog quantum simulator



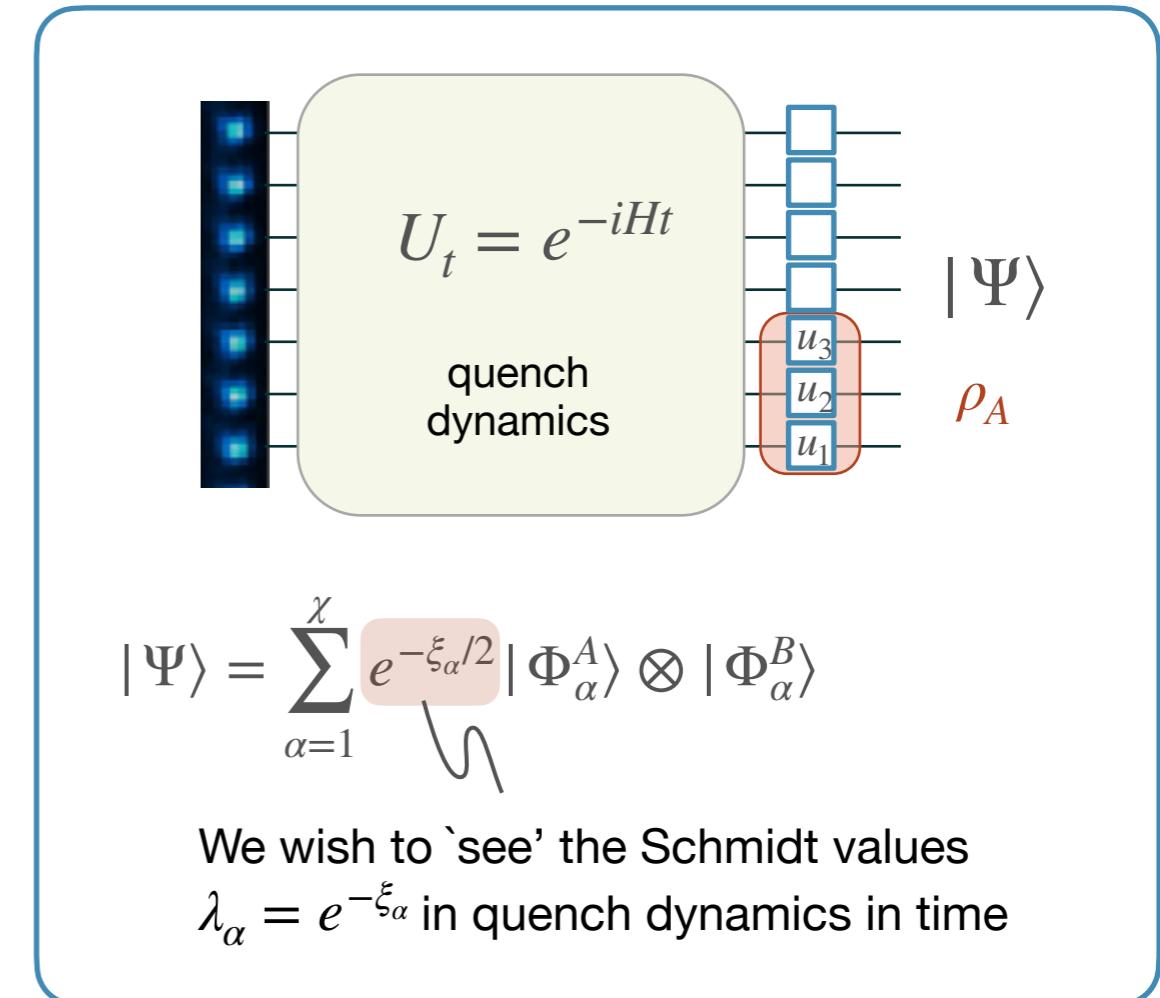
C Kokail, R van Bijnen, A Elben, B Vermersch, & P.Z, Nature Physics (2019); with experimental data from T. Brydges et al., Science (2019)

Example: Entanglement Spectrum & Quench Dynamics Th+Exp

Sub-system [1:5] of 10 ions [similar data for 20 ions and subsystem [8:14]]



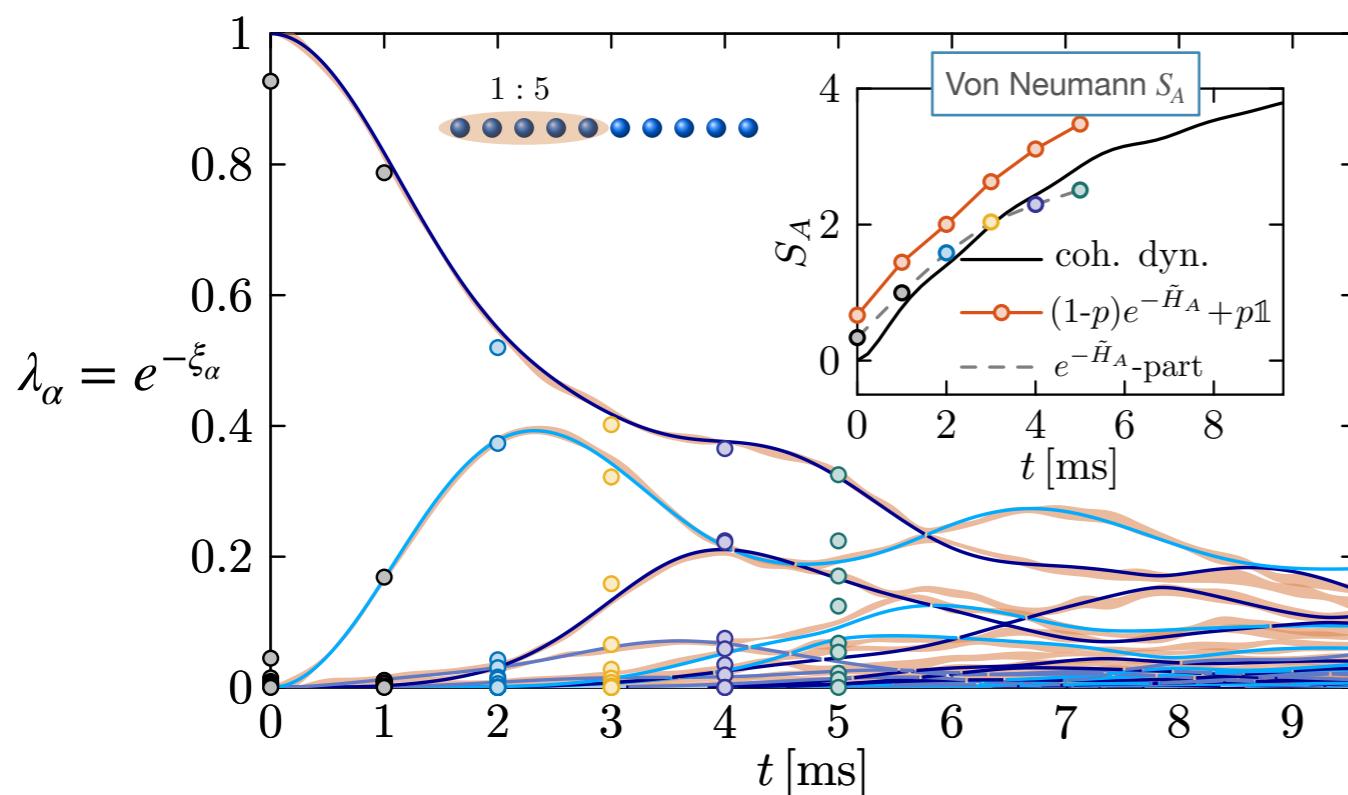
$$H = \sum_{i < j} \left(J_{ij} \sigma_i^+ \sigma_j^- + \text{h.c.} \right) + B \sum_i \sigma_i^z$$



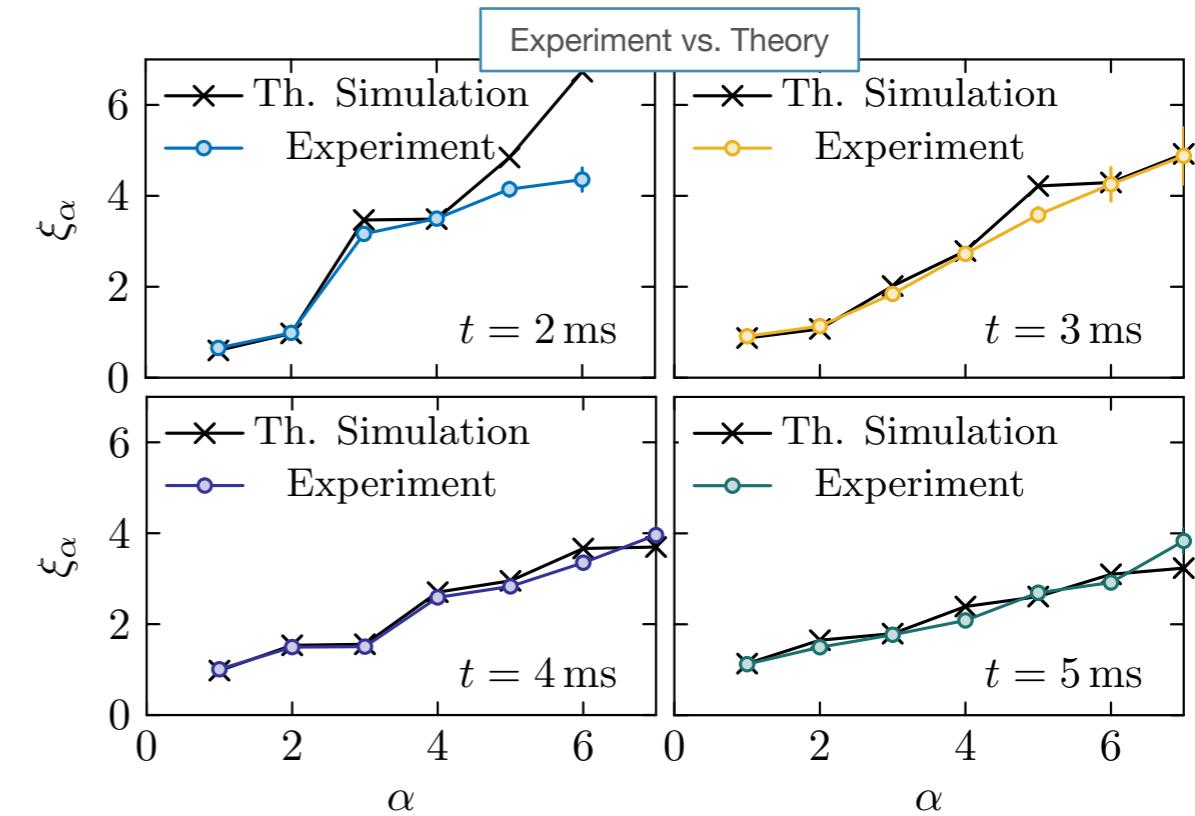
C Kokail, R van Bijnen, A Elben, B Vermersch, & P.Z, Nature Physics (2019); with experimental data from T. Brydges et al., Science (2019)

Example: Entanglement Spectrum & Quench Dynamics Th+Exp

Sub-system [1:5] of 10 ions



$$H = \sum_{i < j} \left(J_{ij} \sigma_i^+ \sigma_j^- + \text{h.c.} \right) + B \sum_i \sigma_i^z \quad \text{for } B \gg J$$



Q.: How to extract the ES (and EH) from experimental data?

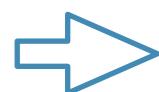
C Kokail, R van Bijnen, A Elben, B Vermersch, & P.Z, Nature Physics (2019); with experimental data from T. Brydges et al., Science (2019)

Outline

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- Characterizing Entanglement in Many-Body Systems

How to measure Entanglement

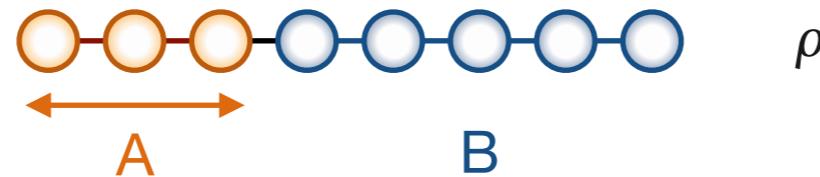


- Renyi Entanglement Entropy
 - ...
- quantum state tomography
 - copies - quantum protocol
 - randomized measurements & classical shadows

The randomized measurement toolbox,
A Elben, ST Flammia, HY Huang, R Kueng, J Preskill, B Vermersch & PZ,
Nature Review Physics (2022)

Measuring Renyi Entanglement Entropy

task: measure 2nd order Renyi entanglement entropy



$$\text{Tr}_A \rho_A^2$$

Renyi entropy n=2

~ purity of subsystem

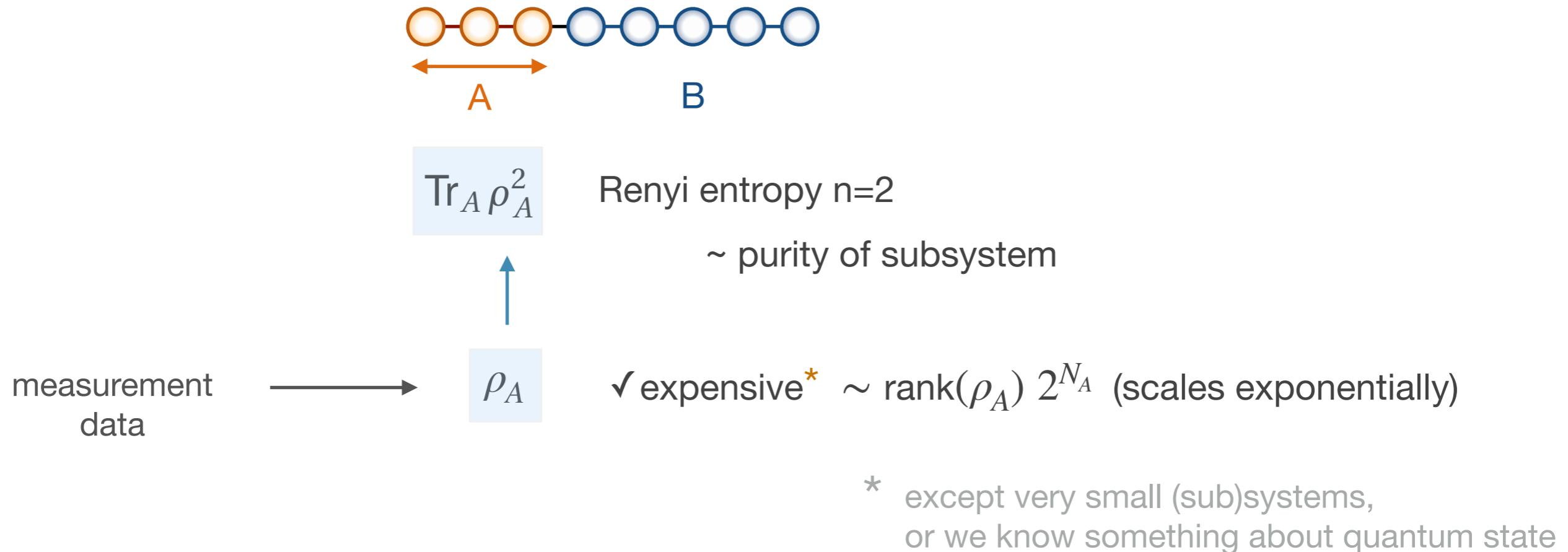


nonlinear functional of density matrix

but expectation values are always linear: $\langle \hat{A} \rangle = \text{Tr}[\hat{A}\rho]$:-)

Measuring Renyi Entanglement Entropy

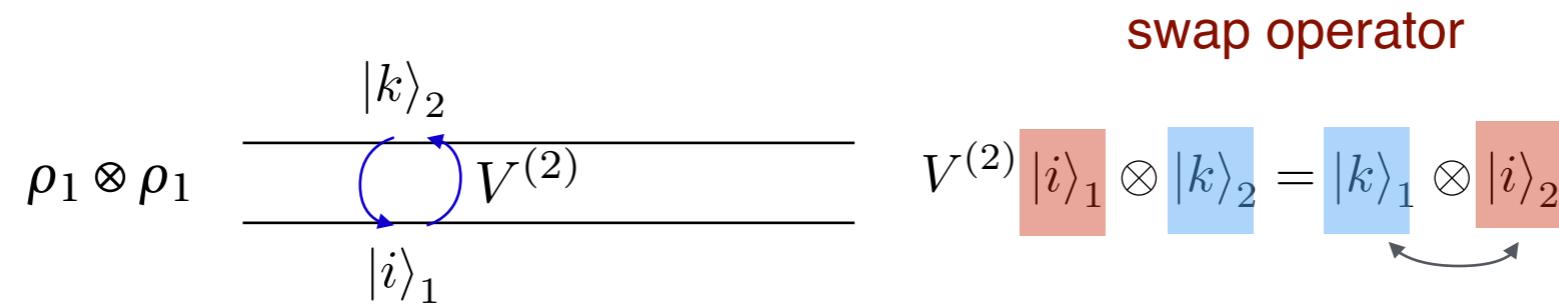
Protocol 0: Quantum State Tomography



Measuring Renyi Entanglement Entropy

Protocol 1: Copies of the quantum system [quantum protocol]

Example n=2:



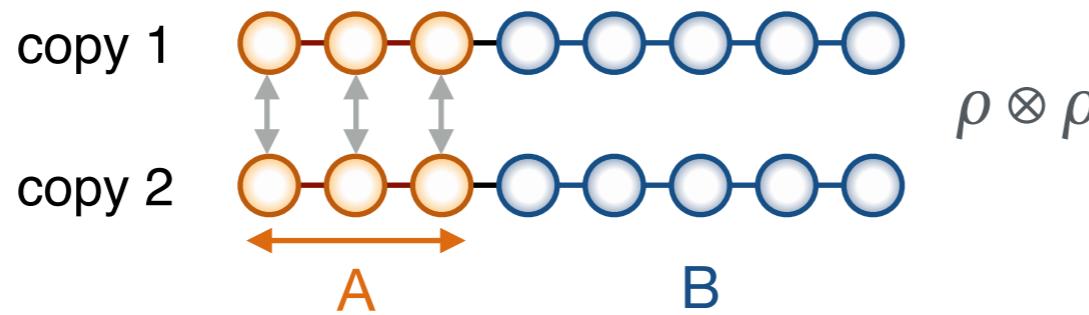
$$\begin{aligned} \text{tr}\{V^{(2)}\rho_1 \otimes \rho_2\} &= \text{tr} \left\{ V^{(2)} \sum_{ijkl} \rho_{ij}^{(1)} \rho_{kl}^{(2)} |i\rangle \langle j| \otimes |k\rangle \langle \ell| \right\} \\ &= \text{tr}\{\rho_1 \rho_2\} \end{aligned}$$

expectation value

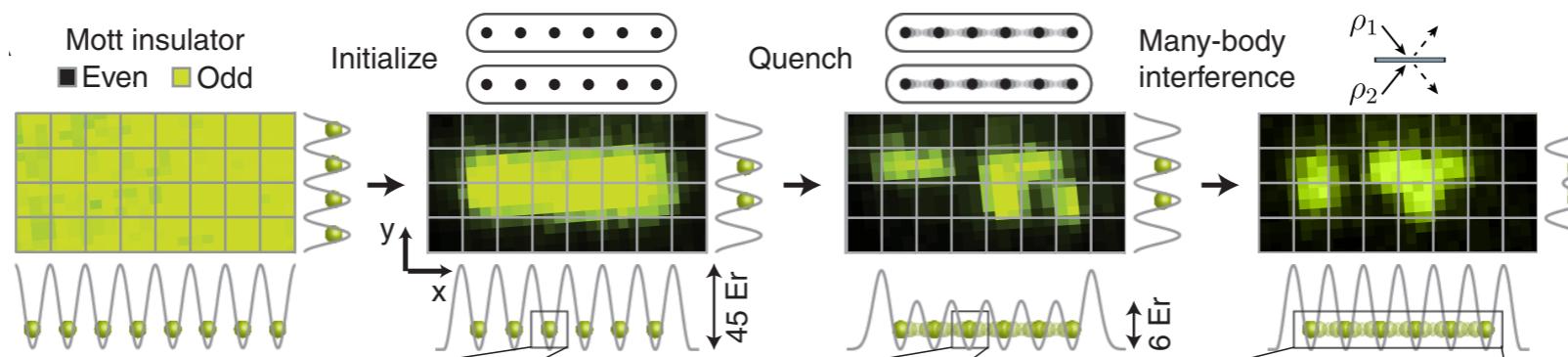
theory: AJ Daley, H Pichler, J Schachenmayer, PZ, PRL (2012); C Moura Alves & D Jaksch, PRL (2004); A. K. Ekert et al.PRL (2002).

Measuring Renyi Entanglement Entropy

Protocol 1: Copies of the quantum system [quantum protocol]



Controlled few-atom systems & quantum gas microscope



see Appendix with details of protocol

experiment: R Islam *et al.*, Nature (2015); AM Kaufmann *et al.*, Science (2016) [Greiner Group]

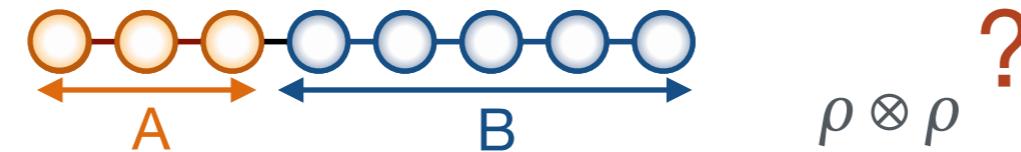
experiment: R Islam *et al.*, Nature (2015); AM Kaufmann *et al.*, Science (2016) [Greiner Group]

Measuring Renyi Entanglement Entropy



Protocol 2: Single copy of quantum system

single system



virtual copy*
(replica trick)

how?

$$\text{Tr}_A \rho_A^2$$

... from Statistical Correlations
in Random Measurements

signal is in the noise

* in contrast to real copies, virtual copies are legal in quantum mechanics

Statistical Correlations in Random Measurements

Protocol for a chain of qubits:

Random measurement

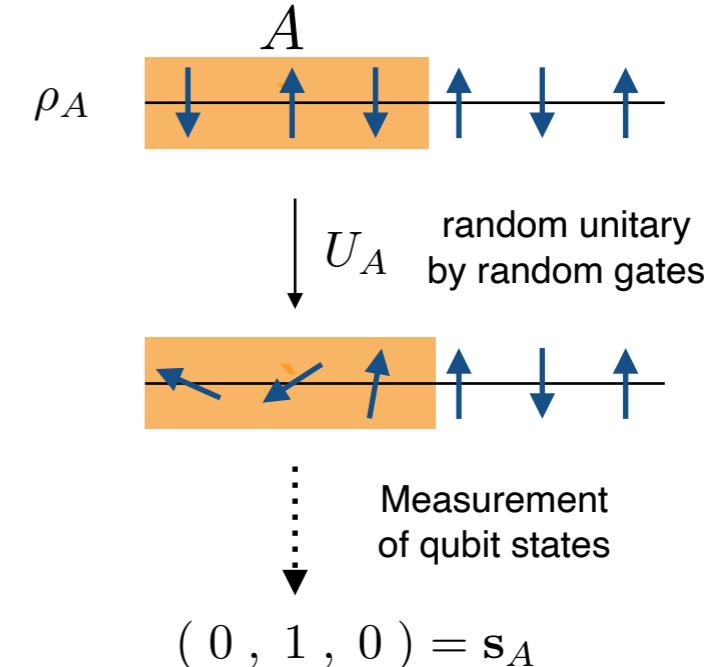
$$P_U(\mathbf{s}_A) = \text{Tr} \left[U_A \rho_A U_A^\dagger |\mathbf{s}_A\rangle \langle \mathbf{s}_A| \right]$$

Average over the Circular Unitary Ensemble (CUE)

$$\overline{P_U(\mathbf{s}_A)} = \frac{1}{N_{\mathcal{H}_A}}$$

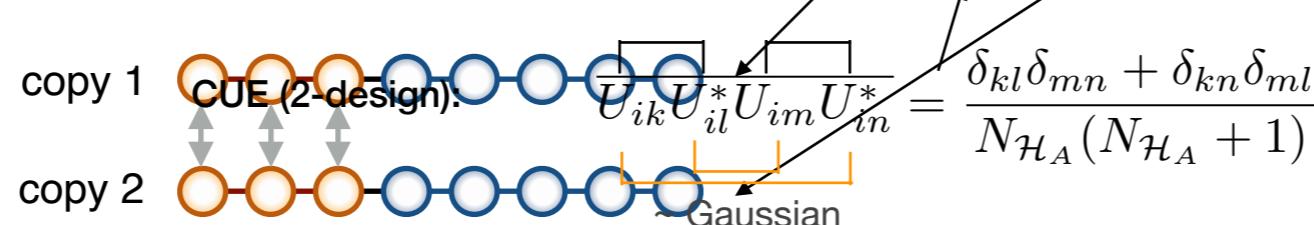
↗
Hilbertspace
dimension of A

$$\overline{P_U(\mathbf{s}_A)^2} = \frac{1 + \text{Tr} [\rho_A^2]}{N_{\mathcal{H}_A}(N_{\mathcal{H}_A} + 1)}$$



Virtual copies:

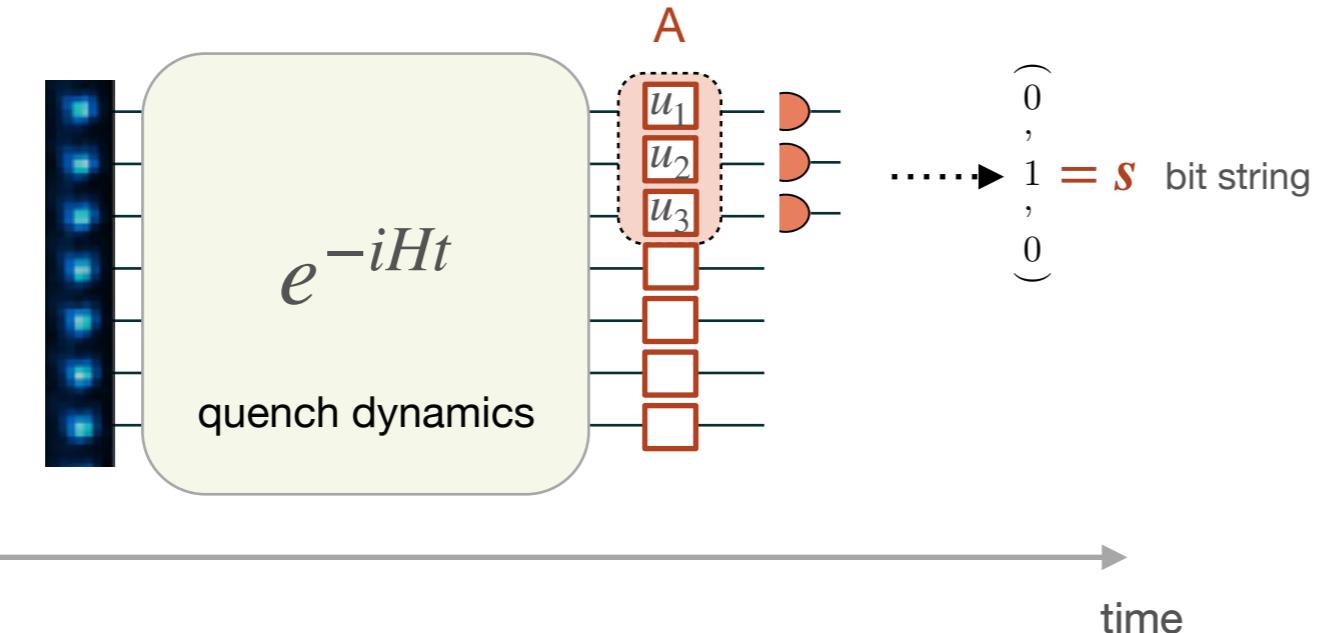
$$\overline{P_U(\mathbf{s}_A)^2} = \overline{\text{Tr}_{1\oplus 2} \left[\dots U_A \rho_A U_A^\dagger \otimes U_A \rho_A U_A^\dagger \right]} = \frac{\text{Tr}_{1\oplus 2} [(1 + S) \rho_A \otimes \rho_A]}{N_{\mathcal{H}_A}(N_{\mathcal{H}_A} + 1)}$$



S van Enk, C Beenakker (PRL 2012)

Randomized Measurements: Local Random Unitaries

Measurement post-processing



$$P_U(\mathbf{s}) = \text{Tr} [U \rho_A U^\dagger |\mathbf{s}\rangle\langle\mathbf{s}|]$$

$$U = \bigotimes_{i \in A} u_i \quad u_i \in \text{CUE}(d)$$

evenly distributed
on Bloch sphere

purity - Renyi entropy

$$\text{Tr} \rho_A^2 = \mathbb{E}_{U \sim \text{CUE}} [\hat{P}_2] \quad \text{with} \quad \hat{P}_2 = 2^{|A|} \sum_{s,s'} (-2)^{-D[s,s']} P_U(s) P_U(s')$$

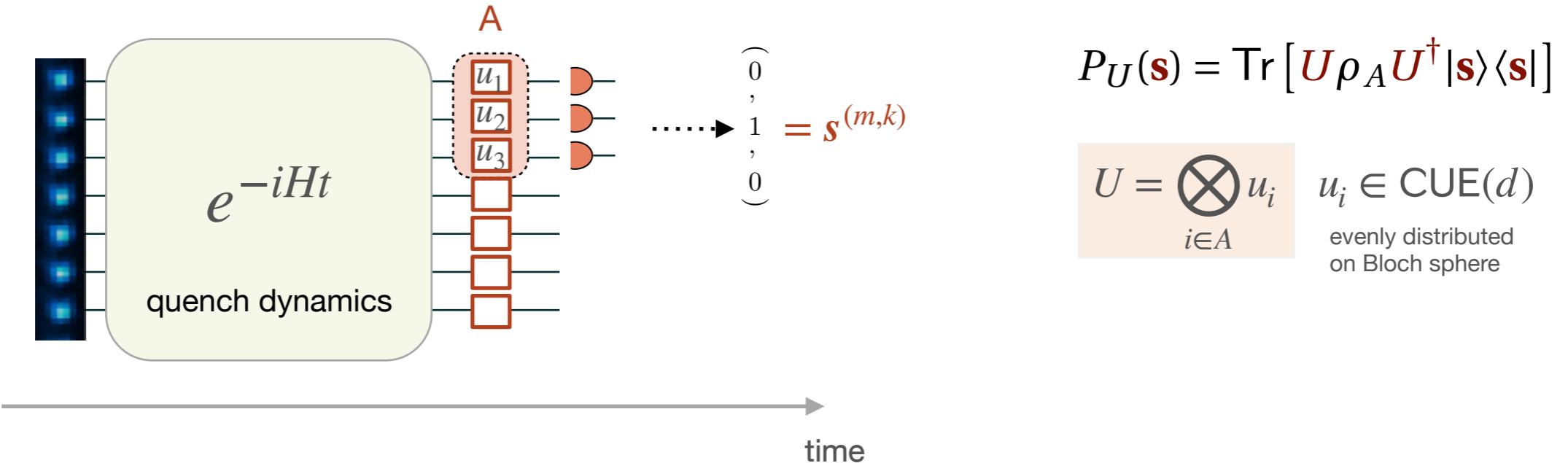
↑
Hamming distance cross-correlation

Random *single spin* rotations are sufficient!

T Brydges, A Elben et al., Science (2019)
A Elben, B Vermersch, et al., PRA (2019)

Randomized Measurements: Local Random Unitaries

Measurement post-processing



$$P_U(\mathbf{s}) = \text{Tr} [\mathbf{U} \rho_A \mathbf{U}^\dagger |\mathbf{s}\rangle\langle\mathbf{s}|]$$

$$U = \bigotimes_{i \in A} u_i \quad u_i \in \text{CUE}(d)$$

evenly distributed
on Bloch sphere

purity - Renyi entropy

$$\text{Tr } \rho_A^2 = \mathbb{E}_{U \sim \text{CUE}} [\hat{P}_2] \quad \text{with} \quad \hat{P}_2 = \frac{1}{MK(K-1)} \sum_{m=1}^M \sum_{k \neq k'=1}^K (-2)^{-D[s^{(m,k)}, s^{(m,k')}]}$$

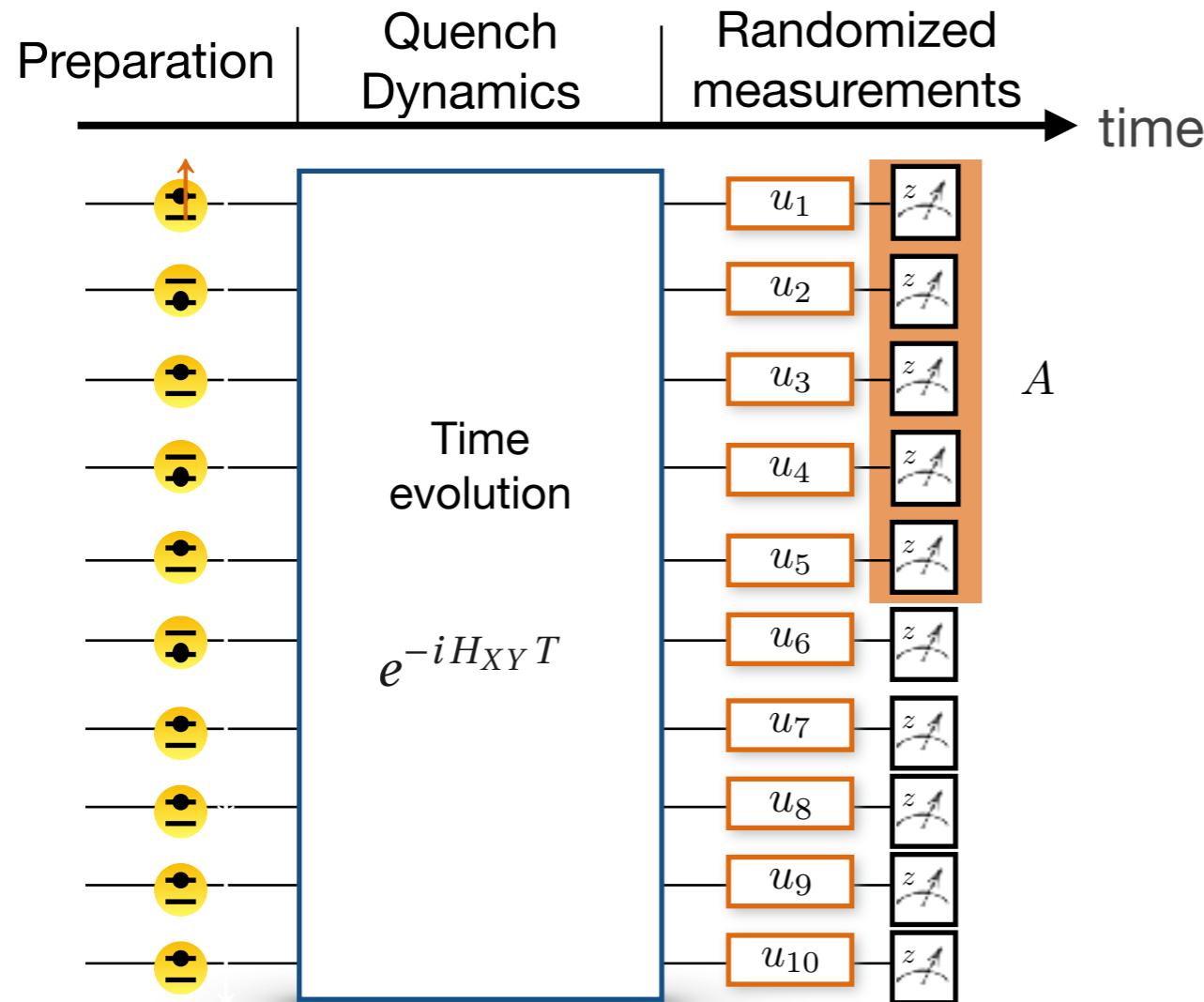
$k, k' = 1, \dots, N_U \equiv K$	$m = 1, \dots, N_M \equiv M$	random unitaries
$\underline{N_U \times N_M}$		# exp runs

- Features:
- local operations & measurements
 - scaling with #unitaries and #measurements?

T Brydges, A Elben et al., Science (2019)

Proof → A Elben, B Vermersch, et al., PRA (2019)

Example 1: Experiment – Entanglement in Quench Dynamics



Hamiltonian

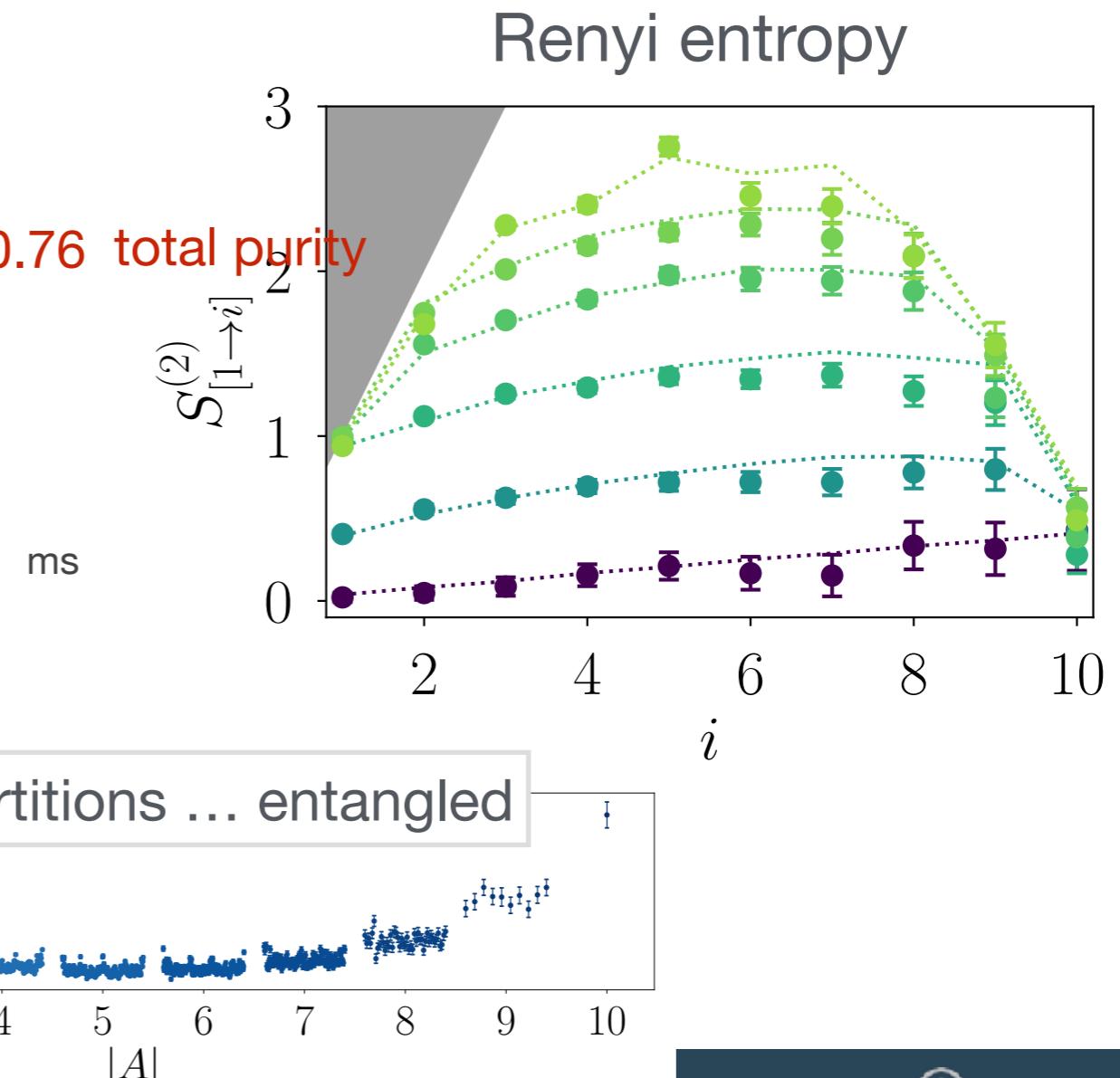
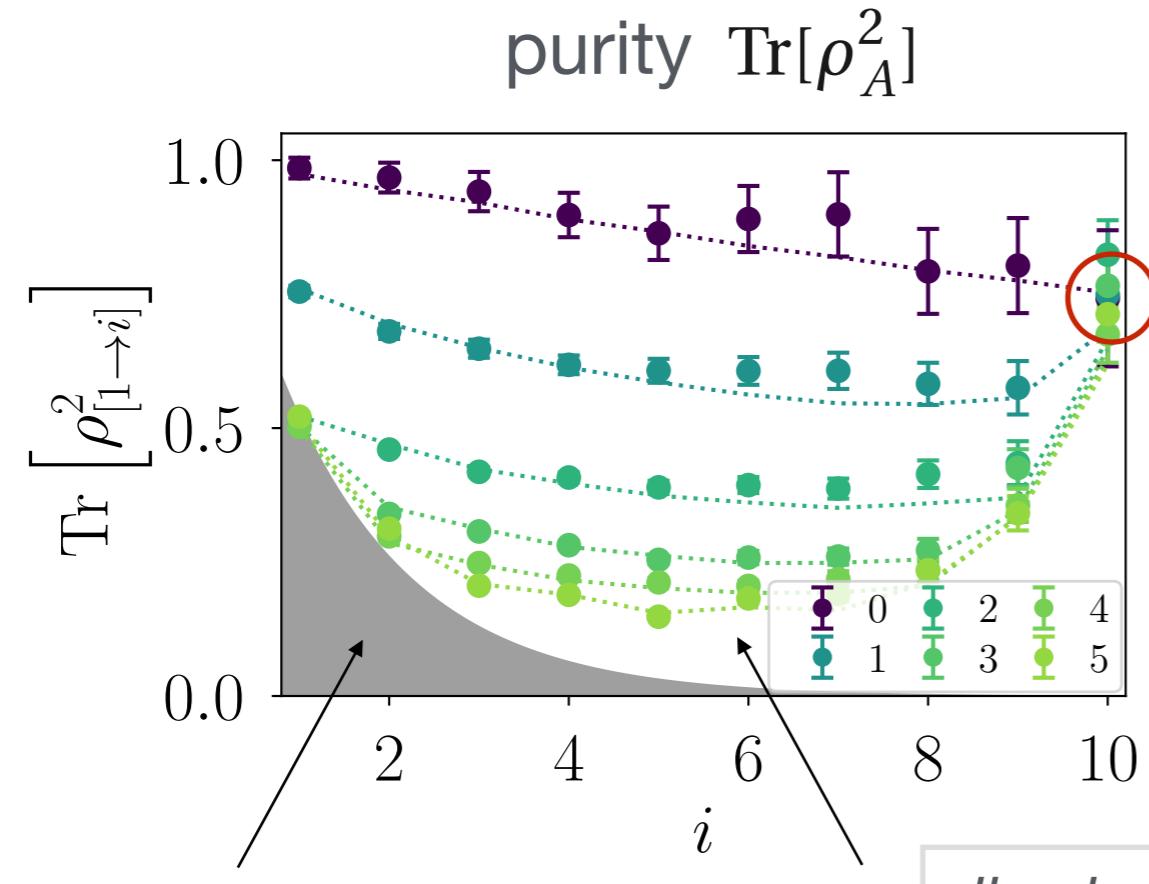
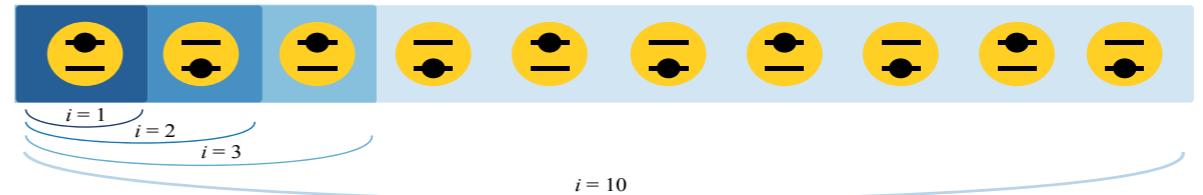
$$H_{XY} = \hbar \sum_{i < j} J_{ij} (\sigma_i^+ \sigma_j^- + \sigma_i^- \sigma_j^+)$$

long range interaction

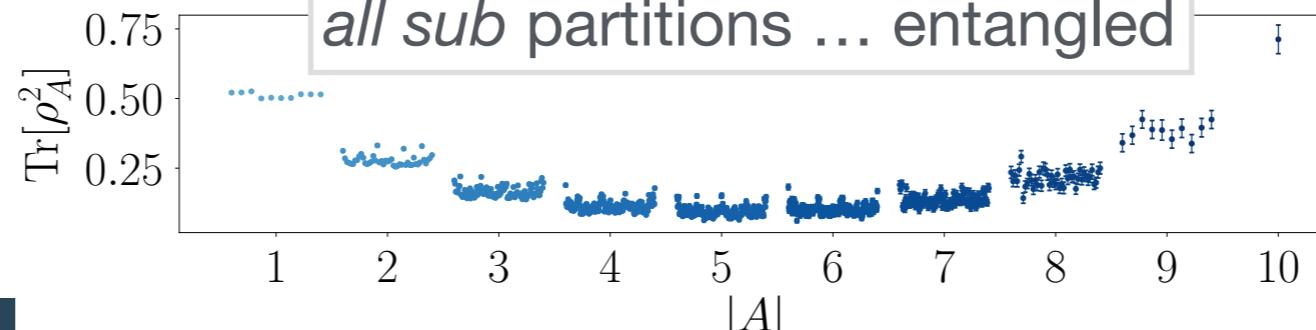
$$+ \hbar \sum_j (B + b_j) \sigma_j^z$$

local disorder potentials

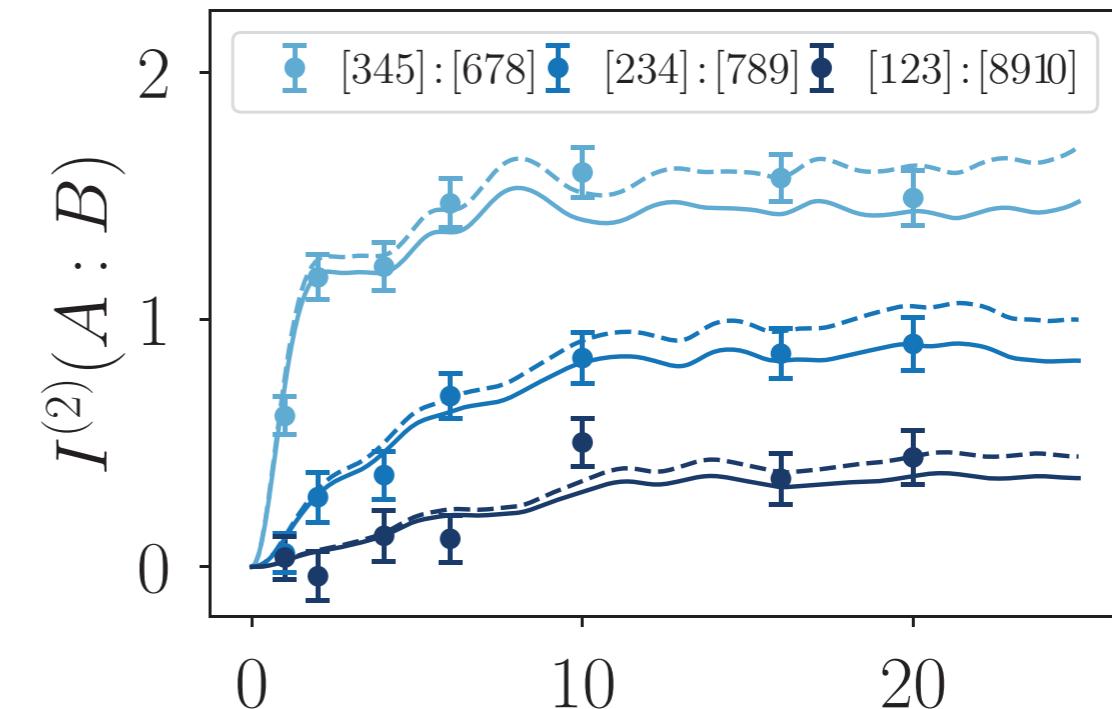
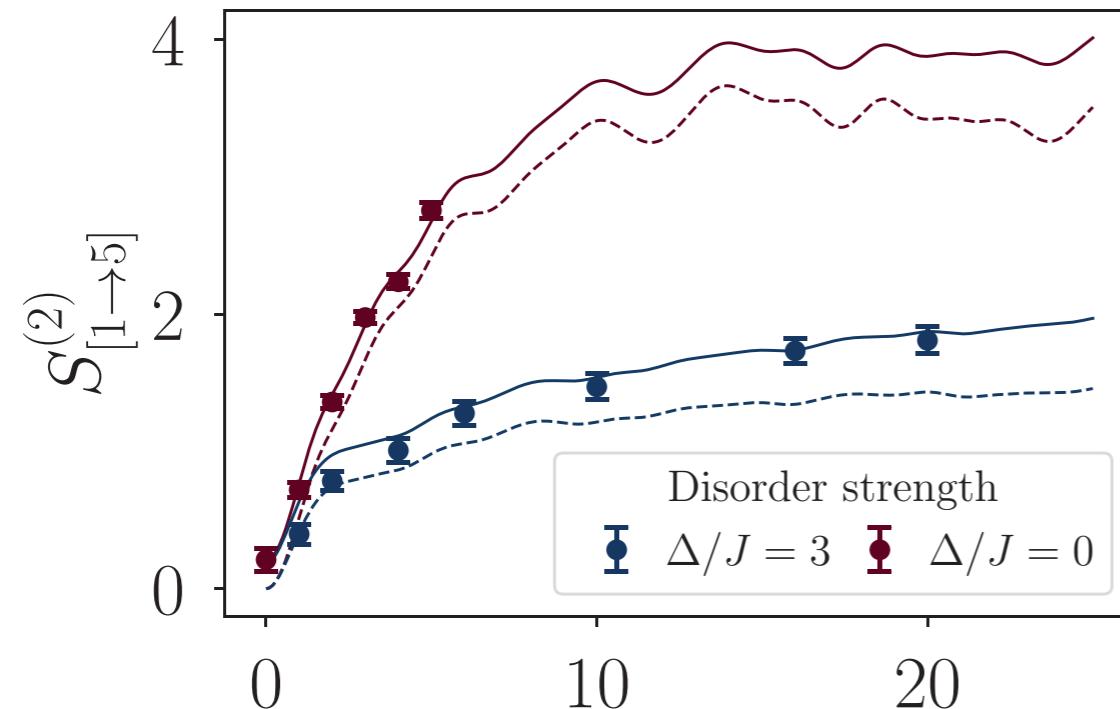
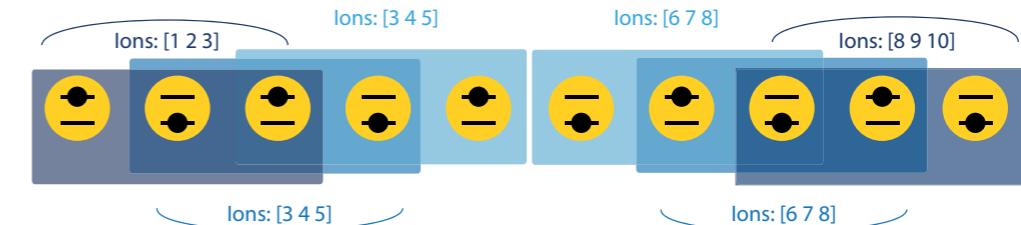
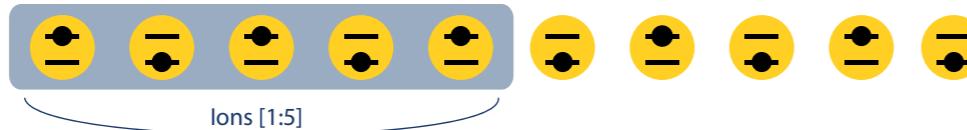
10 Ions [no disorder]



all sub partitions ... entangled



10 Ions [disorder]



Example 2:



A Elben B Vermersch T Brydges MK Joshi
→ Caltech → Grenoble

Editors' Suggestion

Featured in Physics

PHYSICAL REVIEW LETTERS 124, 010504 (2020)

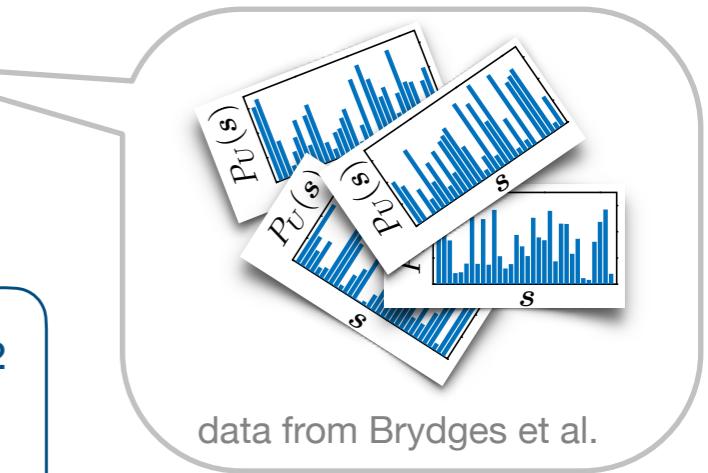
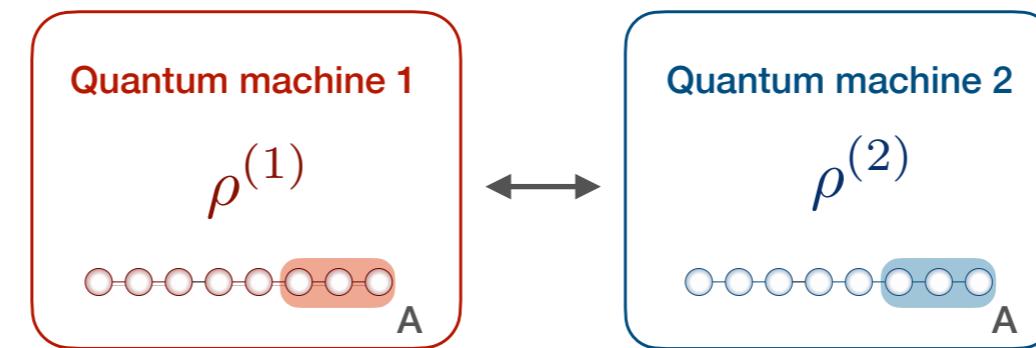
published 6 January 2020

Cross-Platform Verification of Intermediate Scale Quantum Devices

Andreas Elben^{ID}, Benoît Vermersch, Rick van Bijnen, Christian Kokail, Tiff Brydges, Christine Maier, Manoj K. Joshi, Rainer Blatt, Christian F. Roos, and Peter Zoller

$$\mathcal{F}(\rho_A^{(1)}, \rho_A^{(2)}) \sim \text{Tr} [\rho_A^{(1)} \rho_A^{(2)}]$$

How to measure?



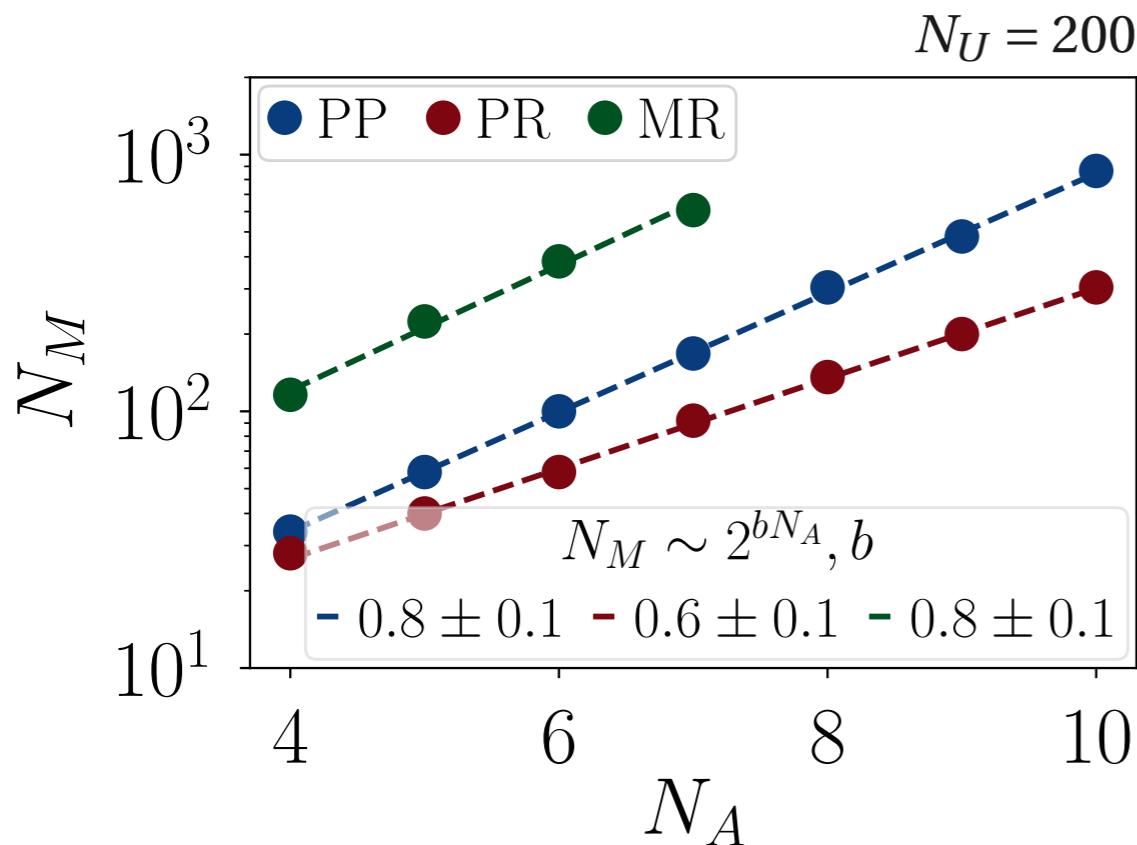
J. Carrasco, A. Elben, C. Kokail, B. Kraus, and P. Zoller, *Theoretical and Experimental Perspectives of Quantum Verification*, PRX Quantum (2021).

J. Eisert, D. Hangleiter, N. Walk, I. Roth, D. Markham, R. Parekh, U. Chabaud, and E. Kashefi, *Quantum certification and benchmarking*, Nature Reviews Physics (2020).

Exp.: D. Zhu et al. (C Monroe), Nat Comm (2022)

Scaling of the required number of measurements [numerical results]

Minimal number of required measurements N_M to estimate $(\mathcal{F}_{\max}(\rho_A, \rho_A))_e$ for error $\epsilon = 0.05$ vs. number qubits N_A for $N_U = 100$.



PP: pure product state
PR: pure Haar random state
MR: mixed random states

Results:

- Scaling statistical error

$$|[\mathcal{F}_{\max}(\rho_A, \rho_A)]_e - 1| \sim 1/(N_M \sqrt{N_U})$$

for $N_M \lesssim D_A = 2^{N_A}$ and $N_U \gg 1$,

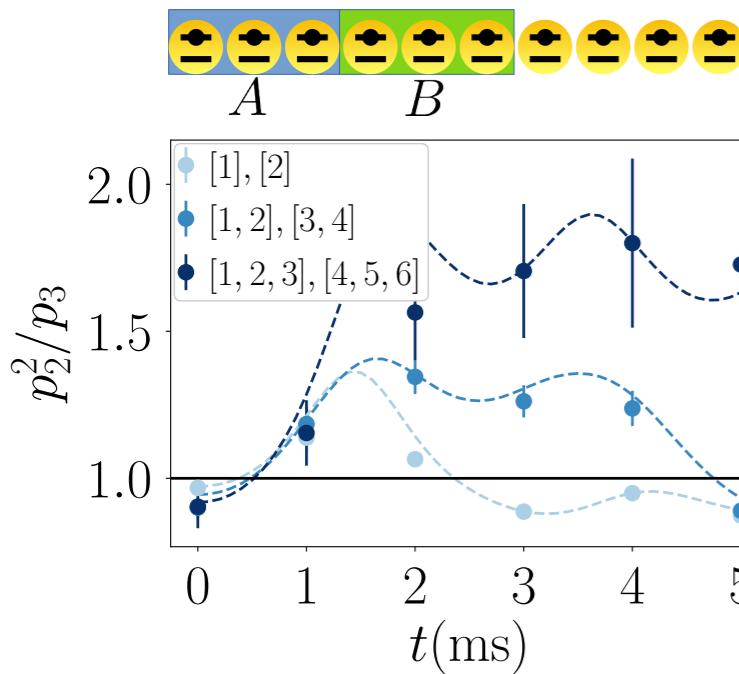
- Scaling experimental runs

$$N_U N_M \sim 2^{bN_A}$$

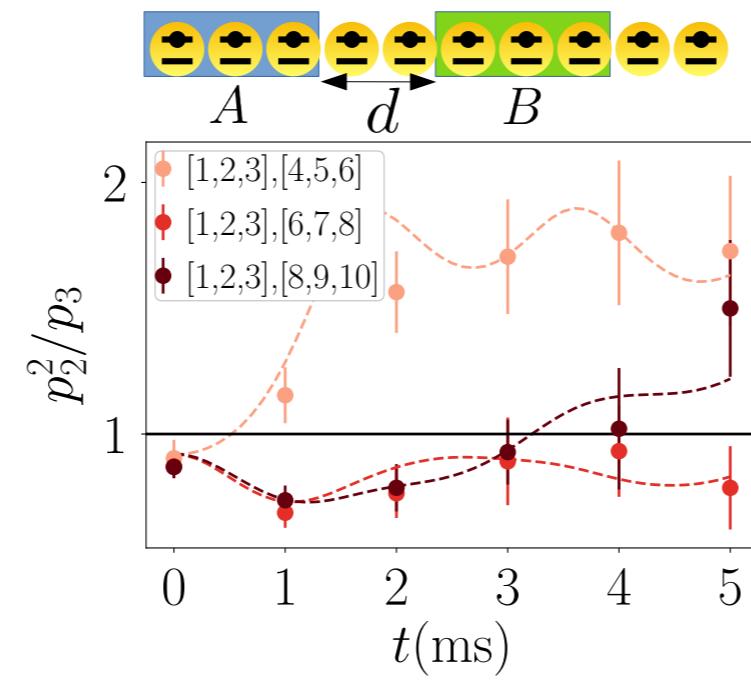
with $b \lesssim 1$ vs. full tomography $b \geq 2$

Example 3:

Mixed State Entanglement

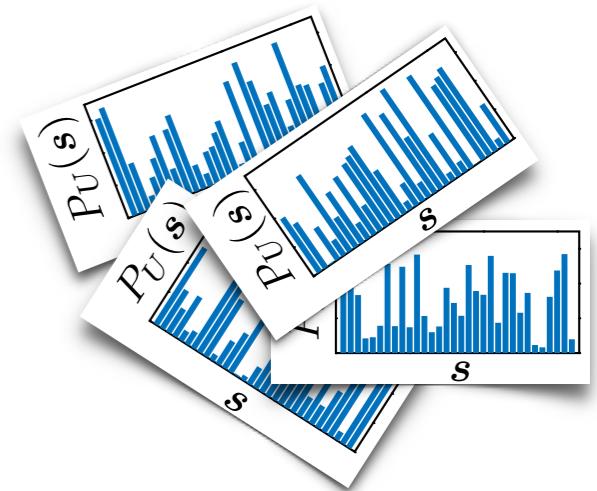


connected subpartitions



disconnected subpartitions

Measure first,
ask questions later



A and B bipartite
entangled iff

$$\rho_{AB} \neq \sum_i p_i \rho_A^{(i)} \otimes \rho_B^{(i)}$$

p3-PPT condition

$$p_3 < p_2^2$$

where

$$p_n = \text{Tr}[(\rho_{AB}^{T_A})^n] \quad \text{PT-moments}$$

→ **sufficient condition**



A Elben → Caltech
B Vermersch → Grenoble



C Kokail R van Bijnen

Randomized Measurements

Exp: T. Brydges, A. Elben et al., Science (2019),
Probing Renyi Entanglement Entropy via Randomized Measurements

Theory: A Elben, B Vermersch, CF Roos, and PZ, PRA (2019),
Randomized Measurements: A Toolbox ...

Classical Shadows

H.-Y. Huang, R. Kueng, and J. Preskill, Nat. Phys. 16, 1050 (2020)
Predicting Many Properties of a Quantum System from Very Few Measurements

Review article

Nature Reviews Physics 1 (2022).

The randomized measurement toolbox

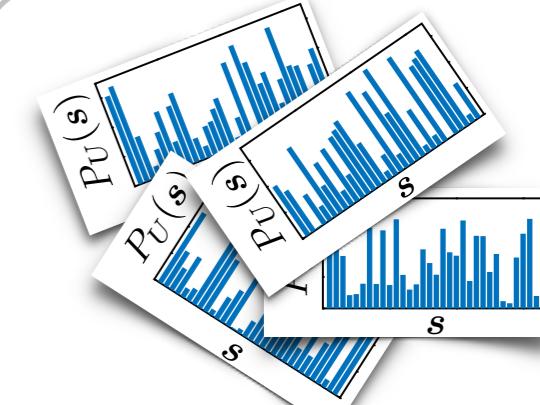
Andreas Elben 1,2,3,4, Steven T. Flammia 1,5, Hsin-Yuan Huang 1,6, Richard Kueng 7, John Preskill 1,2,5,6,
Benoît Vermersch 3,4,8 & Peter Zoller 3,4

Measure first, ask questions later

Randomized Measurements

Exp: T. Brydges, A. Elben et al., Science (2019),
Probing Renyi Entanglement Entropy via Randomized Measurements

Theory: A. Elben, B. Vermersch, CF Roos, and PZ, PRA (2019),
Randomized Measurements: A Toolbox ...



data reused many times ...

Classical Shadows

H.-Y. Huang, R. Kueng, and J. Preskill, Nat. Phys. 16, 1050 (2020)
Predicting Many Properties of a Quantum System from Very Few Measurements

Rigorous error bounds:

$$M \propto \log(L)4^w/\epsilon^2$$

independent randomized
measurements suffice to ...

Review article

Nature Reviews Physics 1 (2022).

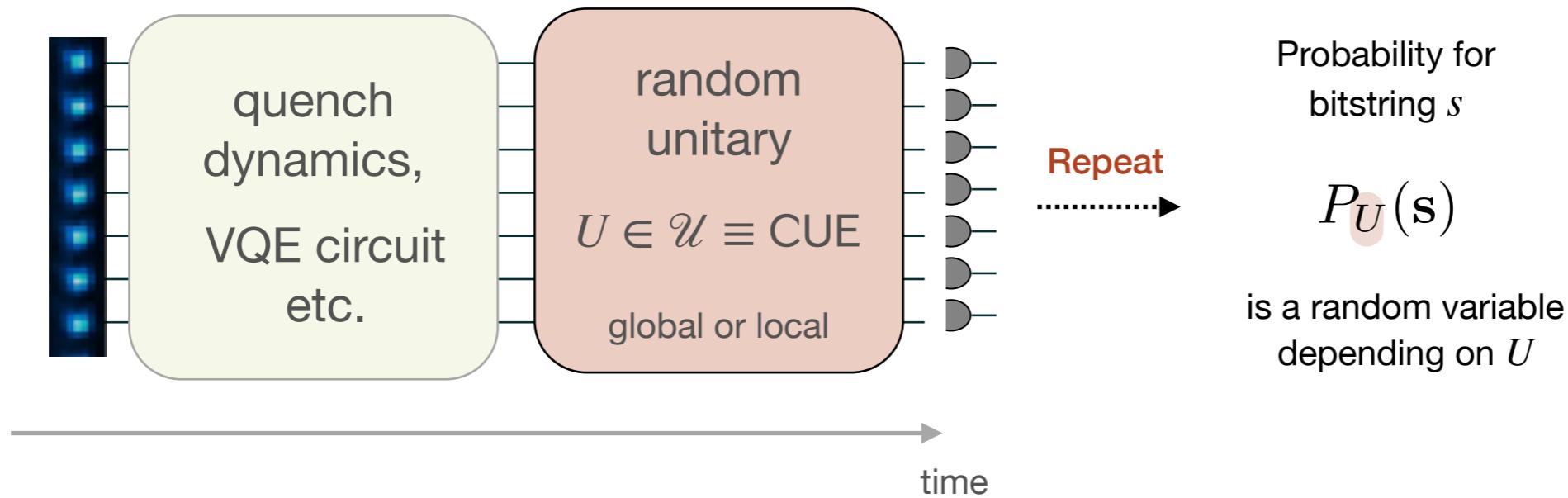
The randomized measurement toolbox

Andreas Elben 1,2,3,4, Steven T. Flammia 1,5, Hsin-Yuan Huang 1,6, Richard Kueng 7, John Preskill 1,2,5,6,
Benoît Vermersch 3,4,8 & Peter Zoller 3,4

Measure first, ask questions later

Randomized Measurements

Measurement post-processing



(Cross-) Correlation of probabilities

'Noise' or ensemble average
(e.g. CUE)

$$\mathbb{E}_{U \sim \mathcal{U}}[P_U(s)P_U(s')]$$

experiment 'day 1, lab 1'

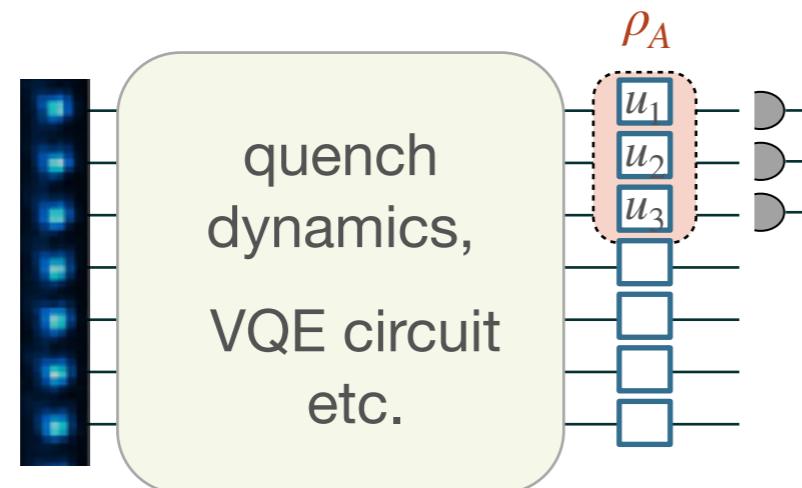
experiment 'day 2 lab 2'

2-design, ...

... hybrid classical-quantum protocols

Randomized Measurements

Measurement post-processing



(Cross-) Correlation of probabilities

$$\mathbb{E}_{U \sim \mathcal{U}}[P_U(\mathbf{s})P_U(\mathbf{s}')]$$

experiment 'day 1, lab 1' experiment 'day 2 lab 2'

A light grey arrow points from the mathematical expression towards the two experimental labels below it.

- OTOCS

theory - B. Vermersch et al., Phys. Rev. X **9**, 021061 (2019).
exp - M. K. Joshi et al., Phys. Rev. Lett. **124**, 240505 (2020).

- topological invariants

theory - A. Elben et al., Science Advances **6**, eaaz3666 (2020).

- Partially transposed density matrix

theory [+ exp] - A. Elben et al., Phys. Rev. Lett. **125**, 200501 (2020).
theory [+ exp] - A. Neven et al., Npj Quantum Inf. **7**, (2021).

- Entanglement Hamiltonian Tomography

theory - C Kokail et al., Nat. Phys. **17**, 936 (2021).
theory + exp - MK Joshi, C Kokail, R van Bijnen et al., arXiv 2023

- Spectral form factor & quantum chaos

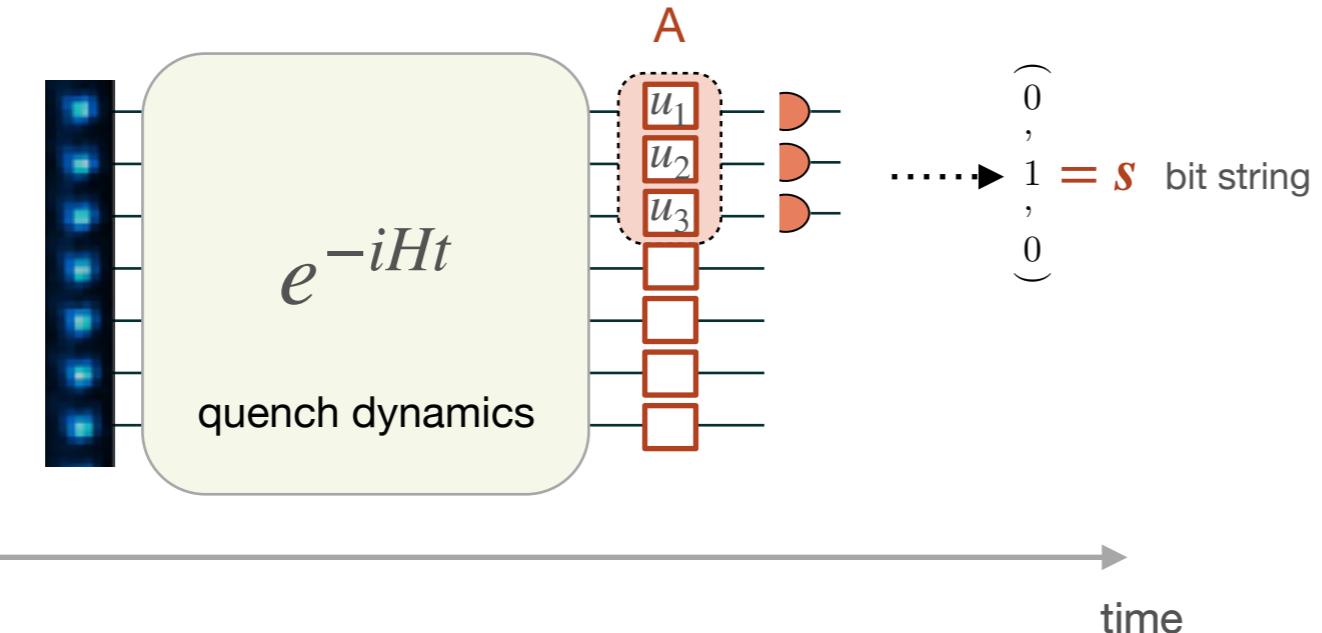
theory - L. K. Joshi et al., Phys. Rev. X. **12**, (2022).
exp - L. K. Joshi et al. with Monroe group, unpublished

- observation of quantum Mpemba effect

theory + exp - MK Joshi et al. unpublished

Randomized Measurements: Local Random Unitaries

Measurement post-processing



$$P_U(\mathbf{s}) = \text{Tr} [U \rho_A U^\dagger |\mathbf{s}\rangle\langle\mathbf{s}|]$$

$$U = \bigotimes_{i \in A} u_i \quad u_i \in \text{CUE}(d)$$

evenly distributed
on Bloch sphere

purity - Renyi entropy

$$\text{Tr} \rho_A^2 = \mathbb{E}_{U \sim \text{CUE}} [\hat{P}_2] \quad \text{with} \quad \hat{P}_2 = 2^{|A|} \sum_{s,s'} (-2)^{-D[s,s']} P_U(s) P_U(s')$$

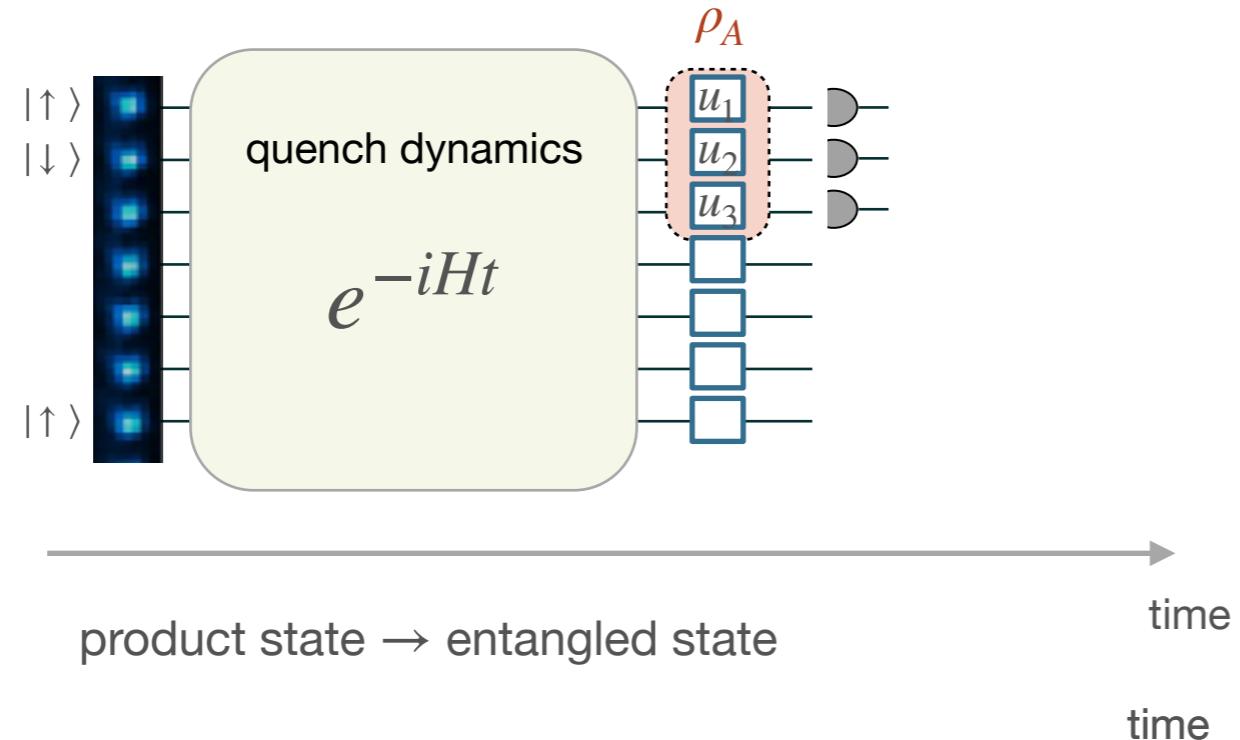
↑
Hamming distance cross-correlation

Random *single spin* rotations are sufficient!

T Brydges, A Elben et al., Science (2019)
A Elben, B Vermersch, et al., PRA (2019)

Randomized Measurements: Tomography

Quench dynamics with analog quantum simulator



Goal: learn operator structure of Entanglement Hamiltonian

$$\rho_A = e^{-\tilde{H}_A}$$

... learn efficiently only if we know something about EH

Randomized Tomography

$$\rho_A = \mathbb{E}_{U \sim \text{CUE}}[\hat{\rho}_A]$$

exponentially expensive



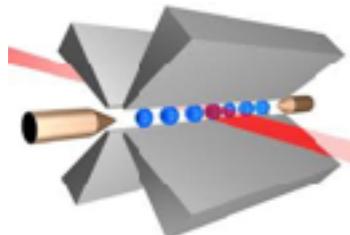
$$\hat{\rho}_A = \sum_{\mathbf{s}, \mathbf{s}'} \sum_U P_U(\mathbf{s}) (-2)^{-D[\mathbf{s}, \mathbf{s}']} U |\mathbf{s}'\rangle \langle \mathbf{s}'| U^\dagger$$

tomographically complete



Exploring Large-Scale Entanglement in Quantum Simulation

Trapped ions



UIBK & IQOQI

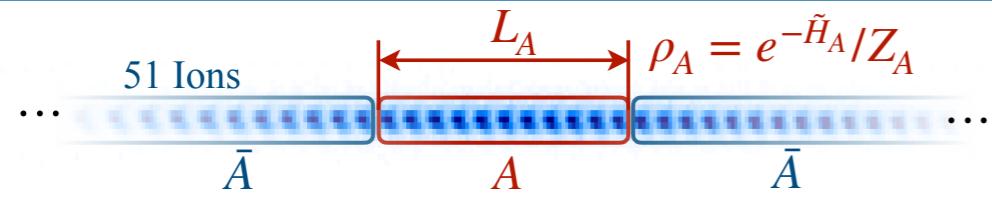
Theory: C Kokail, R van Bijnen, TV Zache, and P.Z.

Experiment: ML Joshi, F Kranzl, R Blatt, CF Roos

Nature online Nov 23, 2023

Early collaborations: M Dalmonte (\rightarrow ICTP), B Vermersch (\rightarrow Grenoble)

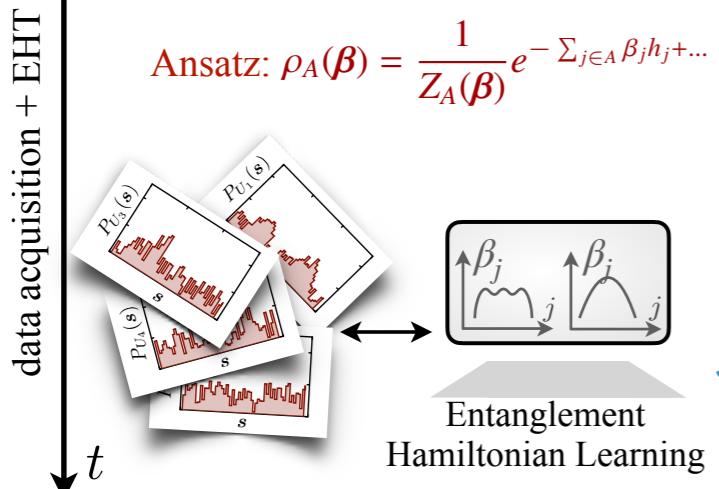
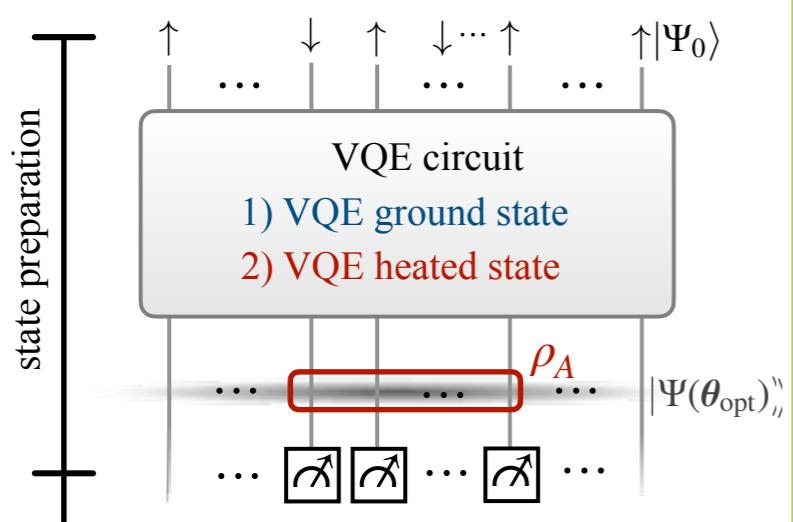
Heisenberg model



XXZ chain

$$H = J \sum_j (S_j^x S_{j+1}^x + S_j^y S_{j+1}^y + \Delta S_j^z S_{j+1}^z) = \sum_j h_j$$

State preparation & analysis



Entanglement properties



volume law entanglement

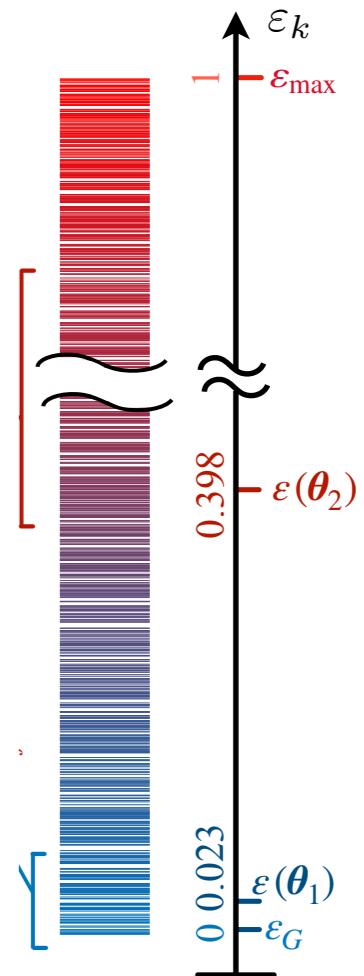
→ heated state

sample-efficient tomography of ρ_A for subsystems > 20 lattice sites

area law entanglement

→ ground state

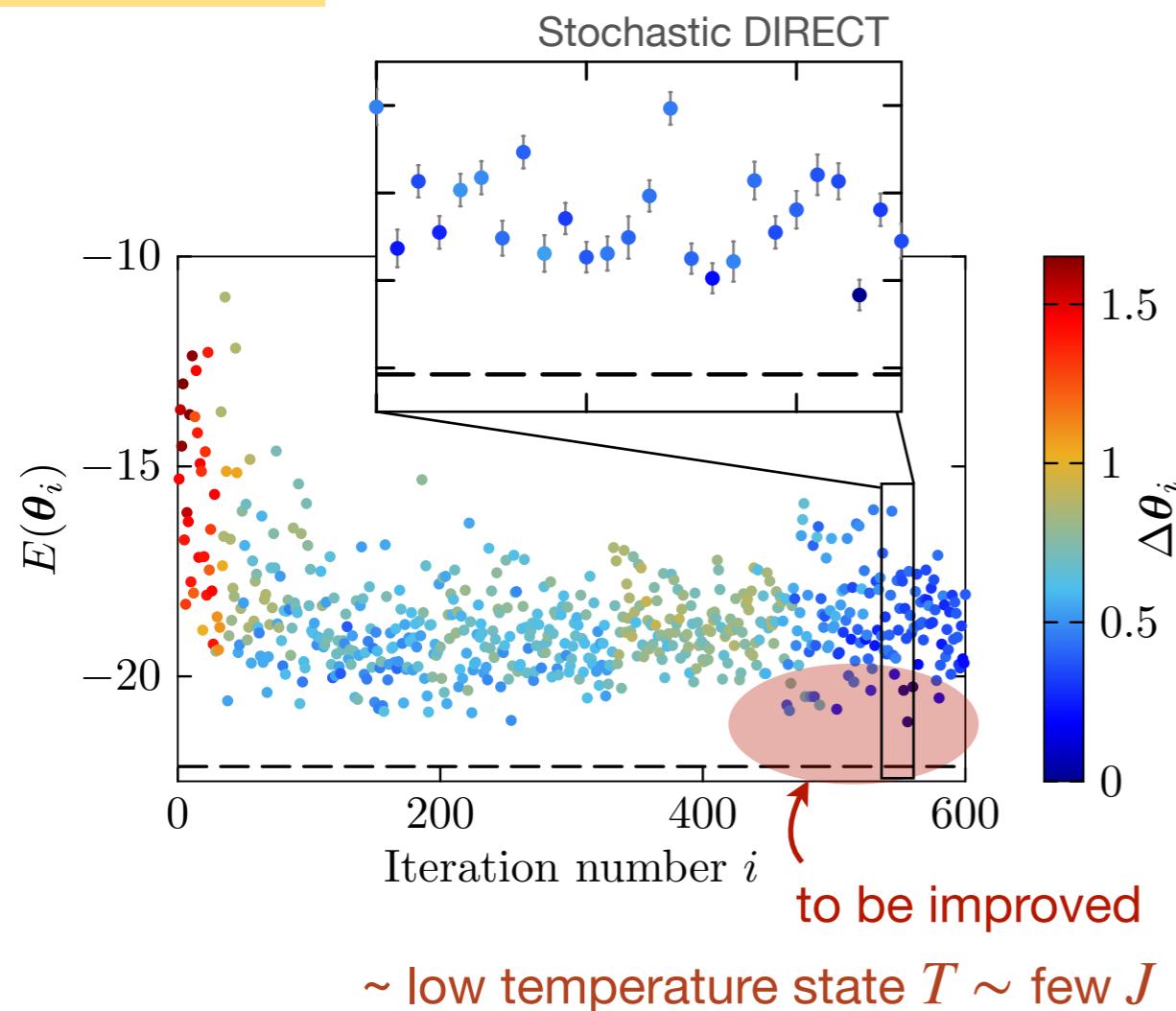
energy spectrum



Experimental Energy Optimization Trajectory for Ground State (VQE)

Theory: C Kokail, R van Bijnen et al., unpublished
Experiment: M Joshi et al., unpublished

N = 51 ions

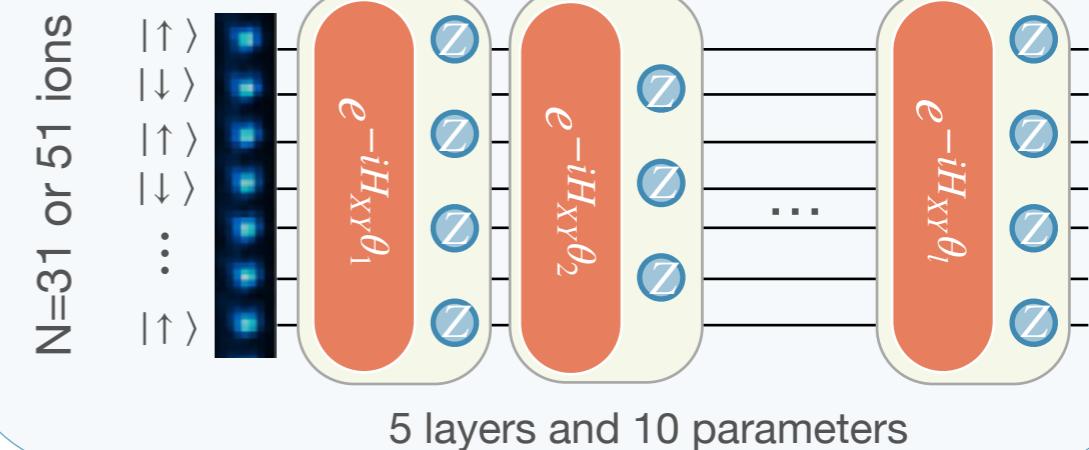


Heisenberg Model (spin- $\frac{1}{2}$)

$$\hat{H} = J \sum_{i=1}^{N-1} \left(\hat{S}_i^x \hat{S}_{i+1}^x + \hat{S}_i^y \hat{S}_{i+1}^y \right) + \Delta \sum_{i=1}^{N-1} \hat{S}_i^z \hat{S}_{i+1}^z + h \sum_{i=1}^N \hat{S}_i^z$$

$J = 1 \quad \Delta = 1 \quad h = 0.5$

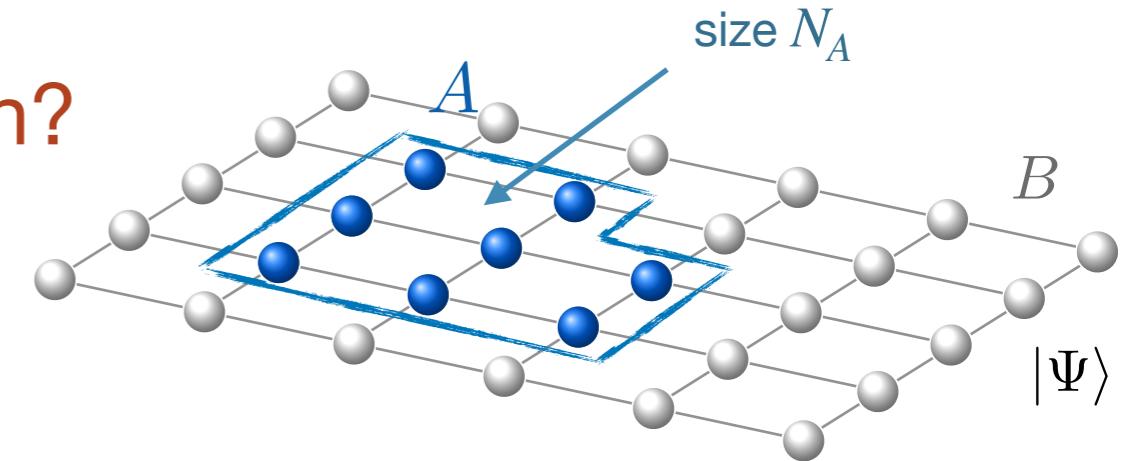
VQE Circuit with Trapped Ion Resources



preliminary

Learning the Entanglement Hamiltonian?

Protocol 0: Quantum state tomography



measurement
data



$$\rho_A = \exp(-\tilde{H}_A)$$

✓ expensive *

exponential in
subsystem size N_A

?

* except: for small system sizes, or if we know something about the quantum state

Do we know something about the *structure* of \tilde{H}_A to make tomography *efficient*?

A. Anshu et al., *Sample-Efficient Learning of Interacting Quantum Systems*, Nat. Phys. **17**, 931 (2021).

Entanglement Hamiltonian in QFT: Bisognano-Wichmann Theorem

Relativistic Quantum Field Theory

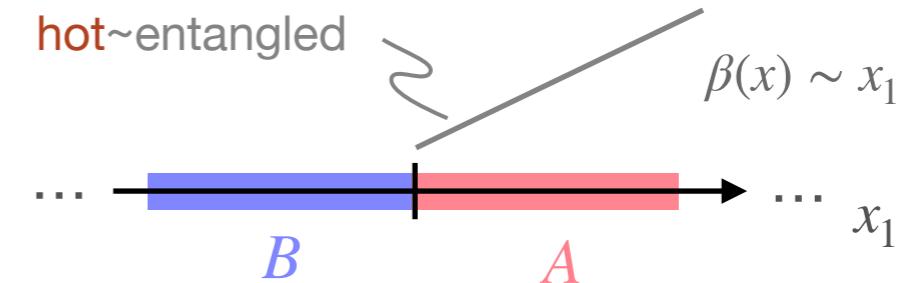
Lorentz invariance

$$H = \int_{A \cup B} d^d x \mathcal{H}(x)$$

vacuum state $|\Omega\rangle$



Entanglement Hamiltonian



$$\rho_A \equiv \text{Tr}_B |\Omega\rangle\langle\Omega| = \exp \left[- \int_A d^d x \beta(x) \mathcal{H}(x) \right]$$

\tilde{H}_A

Gibbs state with *local* temperature $\beta(x) \sim x_1$

EH \tilde{H}_A as *deformed* system Hamiltonian

Bisognano and Wichmann, J. Math. Phys. (1976)

Casini, Huerta & Myers, Journal of HEP (2011)

Review: M Dalmonte, V Eisler, M Falconi, B Vermersch, *Entanglement Hamiltonians - from field theory to lattice models & experiments*, Ann Phys 2022, 534, 2200064

Entanglement Hamiltonian in QFT: Bisognano-Wichmann Theorem

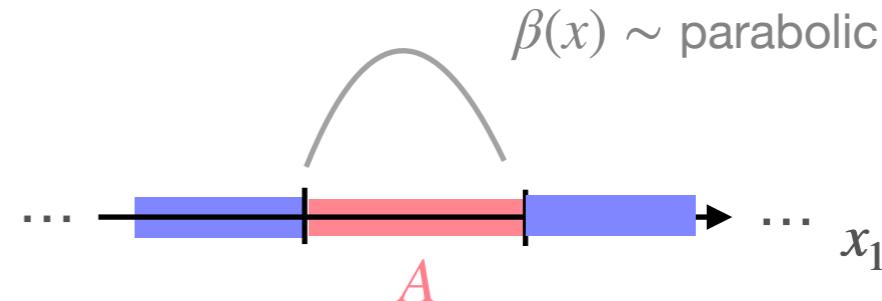
Conformal Field Theory

scale invariance

$$H = \int_{A \cup B} d^d x \mathcal{H}(x)$$

vacuum state $|\Omega\rangle$

Entanglement Hamiltonian



$$\rho_A \equiv \text{Tr}_B |\Omega\rangle\langle\Omega| = \exp \left[- \int_A d^d x \beta(x) \mathcal{H}(x) \right]$$

\tilde{H}_A

Gibbs state with *local* temperature $\beta(x) \sim x_1$

Entanglement Hamiltonian as *deformed* system Hamiltonian

Casini, Huerta & Myers, Journal of HEP (2011)

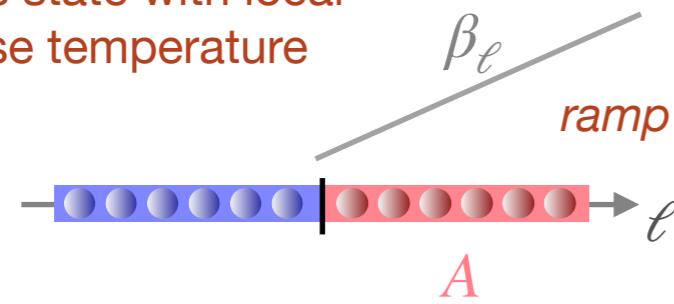
1+1 CFT: Hislop, Longo, Cardy, Calabrese, Tonni, Wen, Ryu, Ludwig, ... (ground state, thermal & quench)

Review: M Dalmonte, V Eisler, M Falconi, B Vermersch, *Entanglement Hamiltonians - from field theory to lattice models & experiments*, Ann Phys 2022, 534, 2200064

Lattice Bisognano-Wichmann & beyond

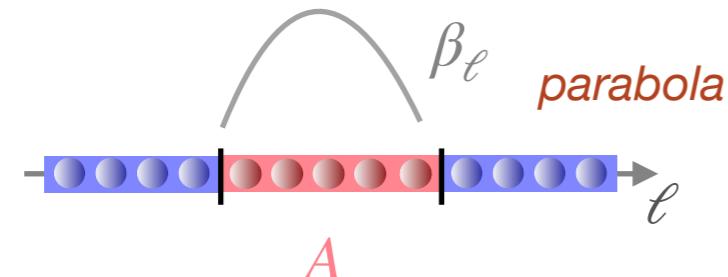
ground state of many-body lattice model

Gibbs state with local inverse temperature



$$\rho_A = e^{-\tilde{H}_A}$$

entanglement Hamiltonian



$$\hat{H} = \sum_{\ell} \hat{h}_{\ell} \quad \text{k-local Hamiltonian}$$

$$\tilde{H}_A = \sum_{\ell \in A} \beta_{\ell} \hat{h}_{\ell} + \dots \quad \text{EH as local deformation of system Hamiltonian}$$

BW recipe

1. Validity of BW-like EH, non-local corrections often sub-leading

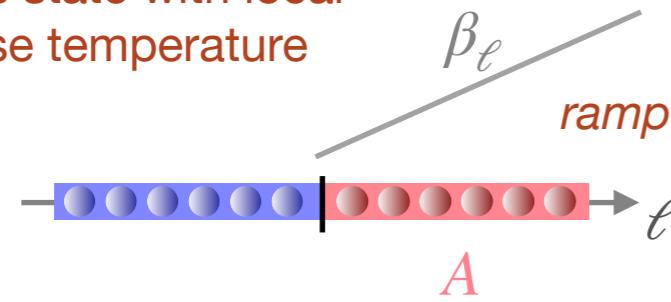
Analytical results: non-interacting, non-critical chains

Numerical evidence: lattice models, quench dynamics

Lattice Bisognano-Wichmann & beyond

ground state of many-body lattice model

Gibbs state with local inverse temperature



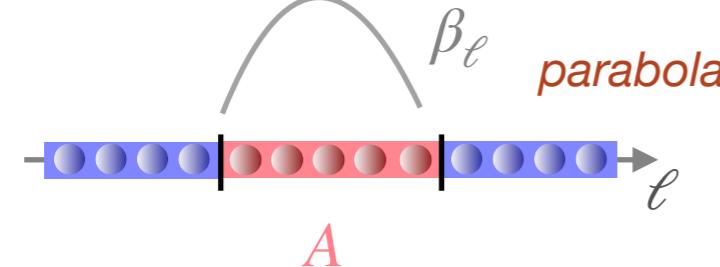
$$\rho_A = e^{-\tilde{H}_A}$$

entanglement Hamiltonian

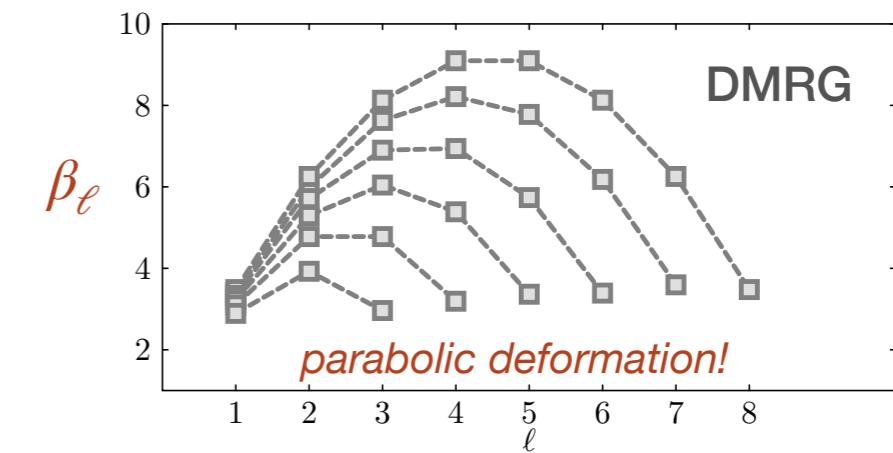
$$\hat{H} = \sum_{\ell} \hat{h}_{\ell} \quad \text{k-local Hamiltonian}$$

$$\tilde{H}_A = \sum_{\ell \in A} \beta_{\ell} \hat{h}_{\ell} + \dots \quad \text{EH as local deformation of system Hamiltonian}$$

BW recipe



Numerical example: Heisenberg model 1D

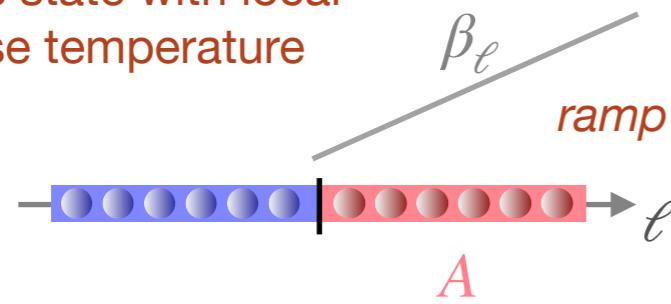


Review: M Dalmonte, V Eisler, M Falconi, B Vermersch, *Entanglement Hamiltonians - from field theory to lattice models & experiments*, Ann Phys 2022, 534, 2200064

Lattice Bisognano-Wichmann & beyond

ground state of many-body lattice model

Gibbs state with local inverse temperature



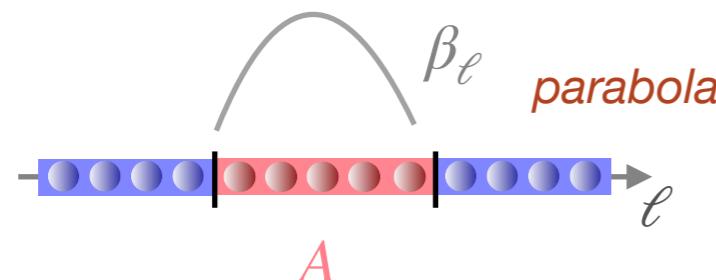
$$\rho_A = e^{-\tilde{H}_A}$$

entanglement Hamiltonian

$$\hat{H} = \sum_{\ell} \hat{h}_{\ell} \quad \text{k-local Hamiltonian}$$

$$\tilde{H}_A = \sum_{\ell \in A} \beta_\ell \hat{h}_\ell + \dots \quad \text{EH as local deformation of system Hamiltonian}$$

BW recipe



2. suggests an efficient ansatz to 'learn' Entanglement Hamiltonian

Entanglement in Many-Body Quantum Systems

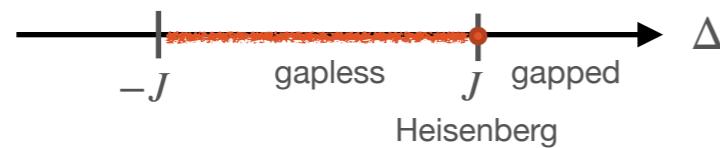
Many-Body Problem

Hamiltonian

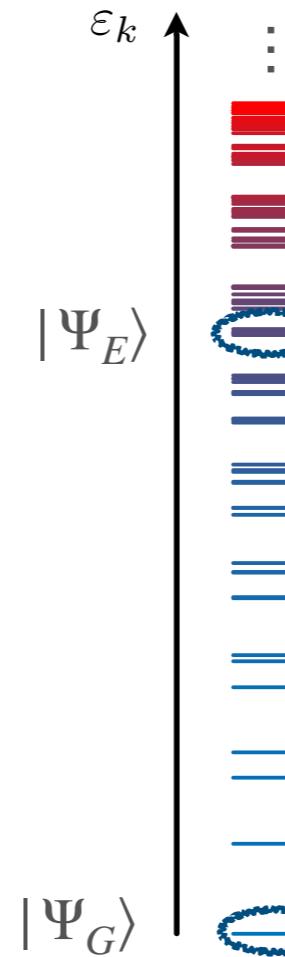
$$\hat{H} = \sum_j \hat{h}_j \quad \text{k-local}$$

Example: XXZ / Heisenberg model (1D)

$$\hat{H}_T = J \sum_{i=1}^{N-1} \left(\hat{S}_i^x \hat{S}_{i+1}^x + \hat{S}_i^y \hat{S}_{i+1}^y \right) + \Delta \sum_{i=1}^{N-1} \hat{S}_i^z \hat{S}_{i+1}^z$$



energy spectrum



excited state

$$S_A \propto V = L_A^d$$

thermal entropy

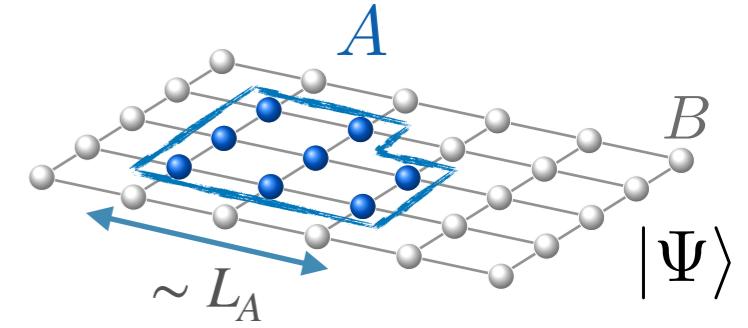
volume law entanglement

ground state

$$S_A \propto L_A^{d-1}$$

area law entanglement

$$\sim c \log L_A \text{ CFT } d = 1$$



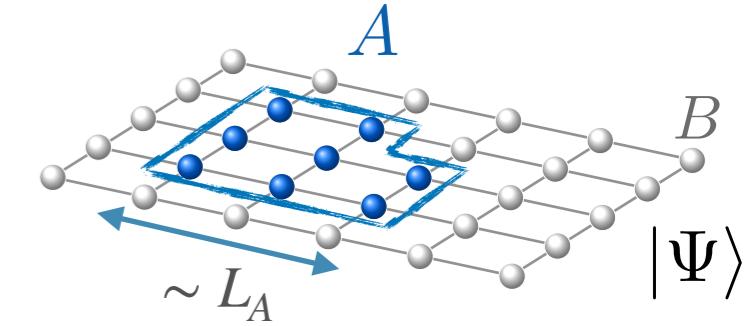
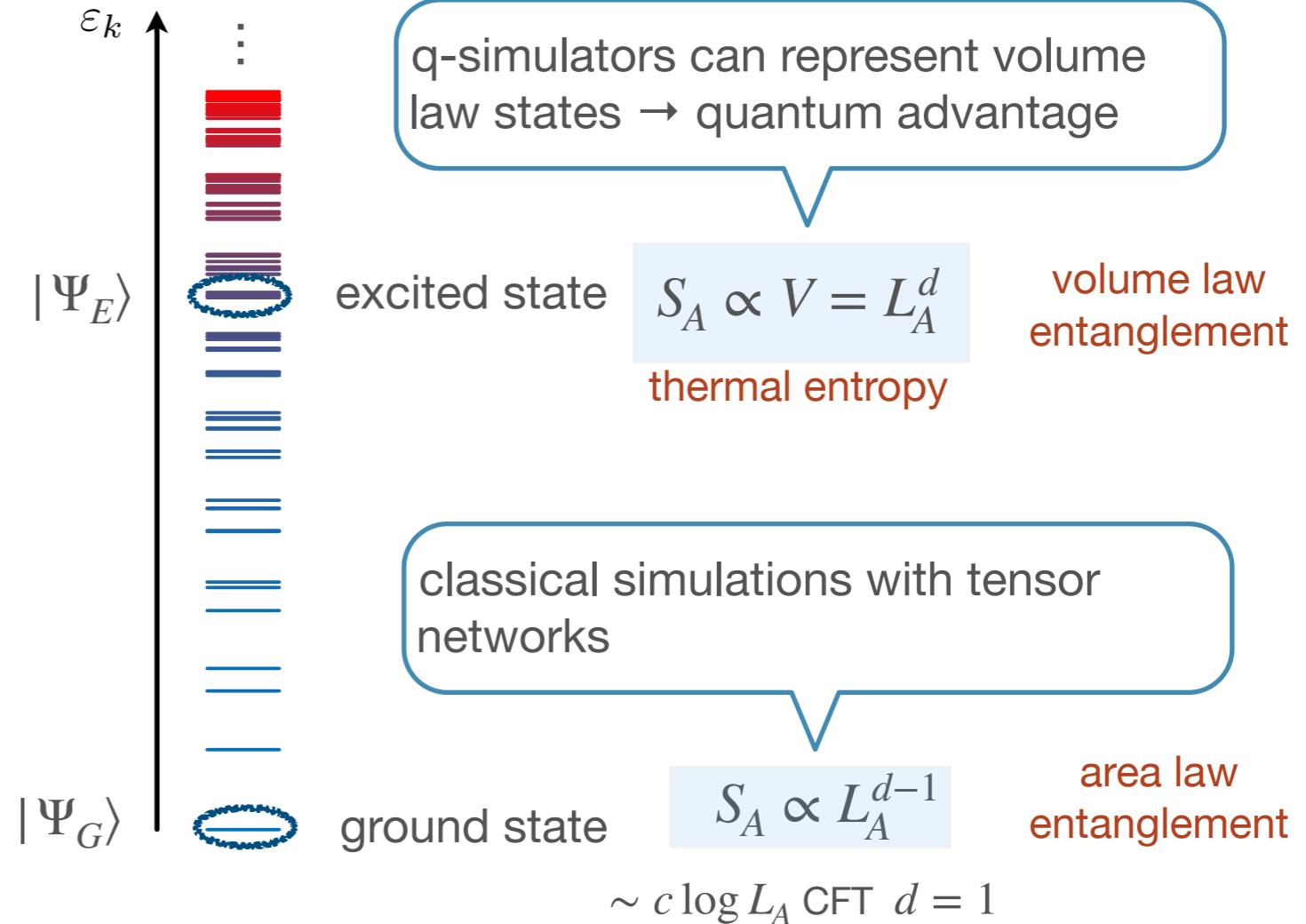
Area Law vs. Volume Law Entanglement

Many-Body Problem

Hamiltonian

$$\hat{H} = \sum_j \hat{h}_j \quad \text{k-local}$$

energy spectrum



Entanglement Hamiltonian & Eigenstate Thermalization Hypothesis

Eigenstate Thermalization Hypothesis (ETH):

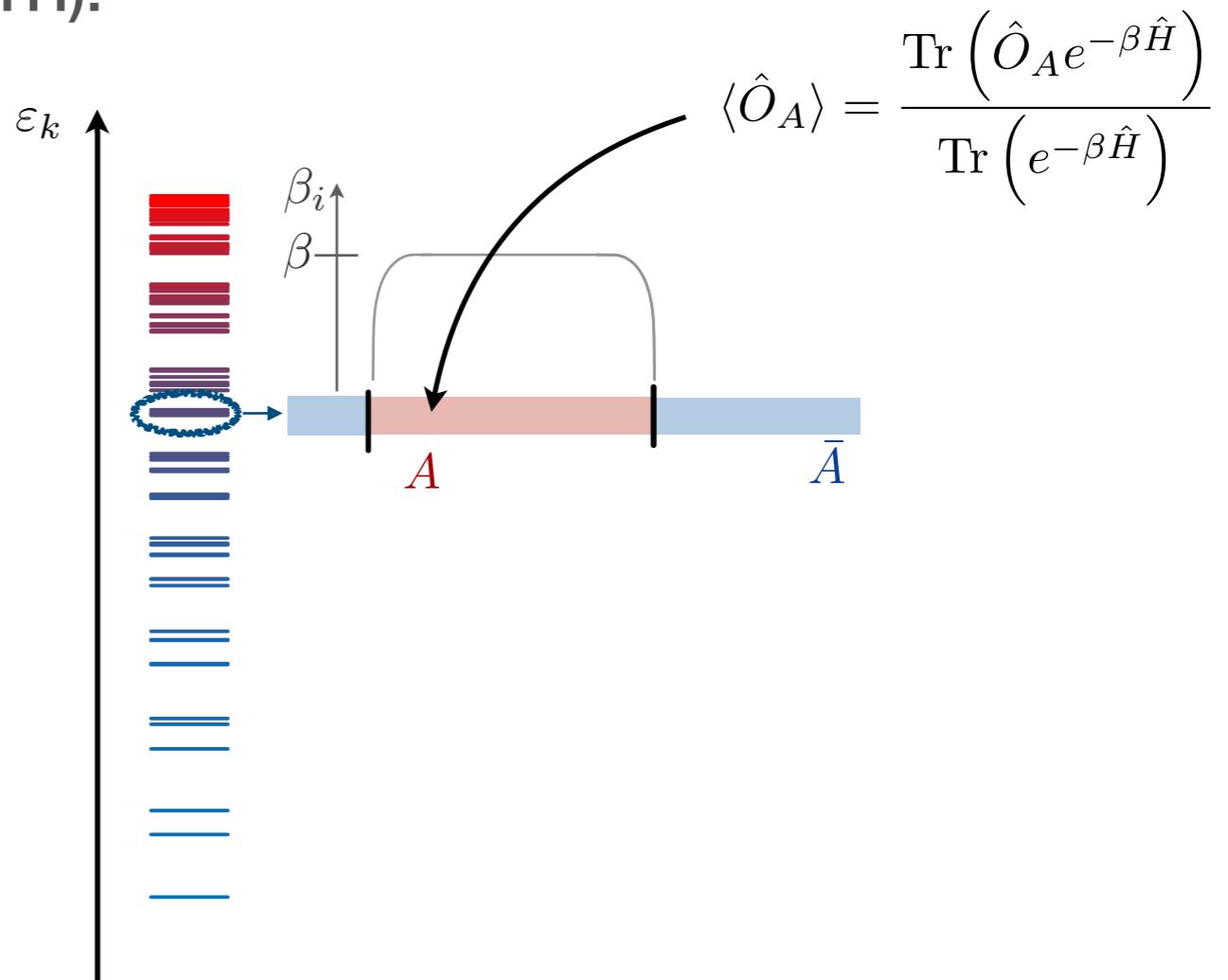
local Hamiltonian: $\hat{H} = \sum_i \hat{h}_i$

reduced density matrix of a subsystem $:A$

$$\rho_A \approx \frac{1}{Z} e^{-\beta \hat{H}_A}$$

$$\approx \frac{1}{Z} e^{-\sum_i \beta_i \hat{h}_i}$$

local temperature profile



Entanglement Hamiltonian & Eigenstate Thermalization Hypothesis

Eigenstate Thermalization Hypothesis (ETH):

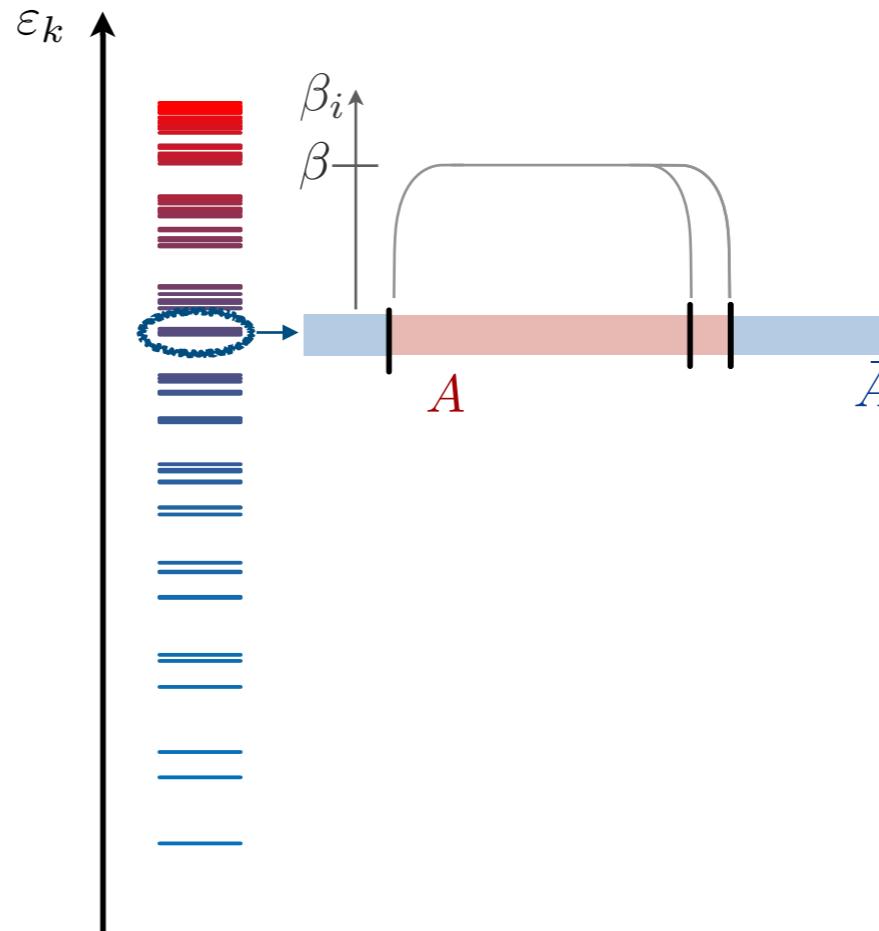
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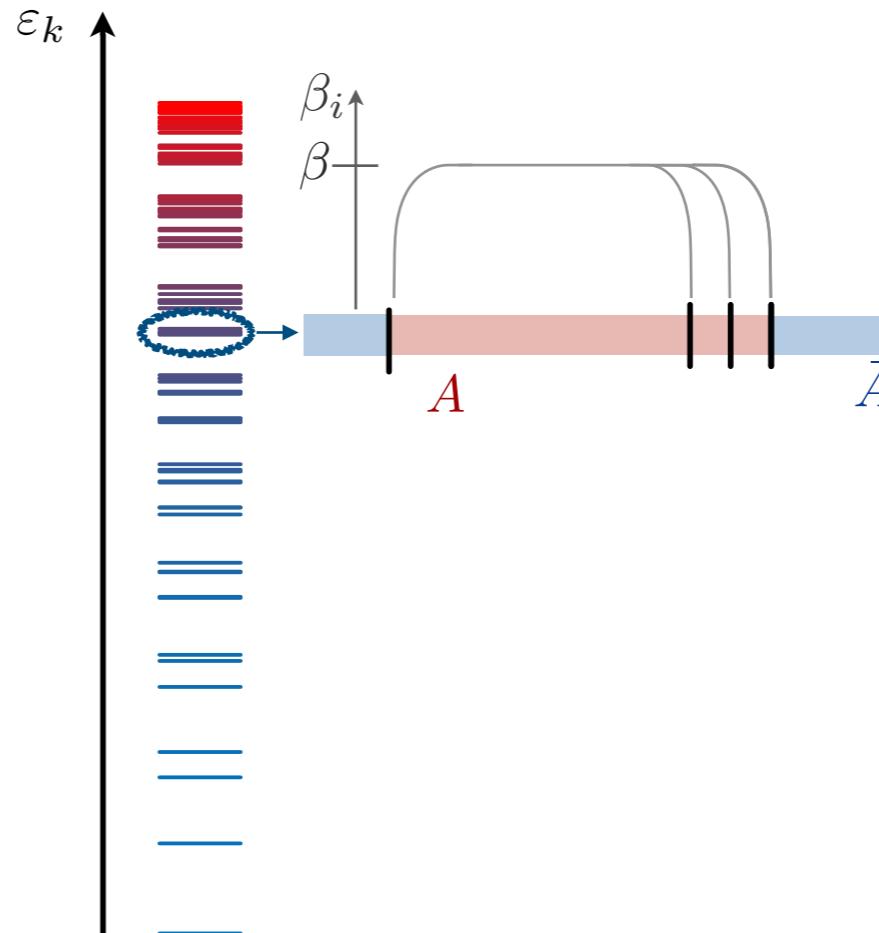
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Entanglement Hamiltonian & Eigenstate Thermalization Hypothesis

Eigenstate Thermalization Hypothesis (ETH):

$$S_A^{\text{VN}} = \sim \langle \hat{H}_A \rangle$$

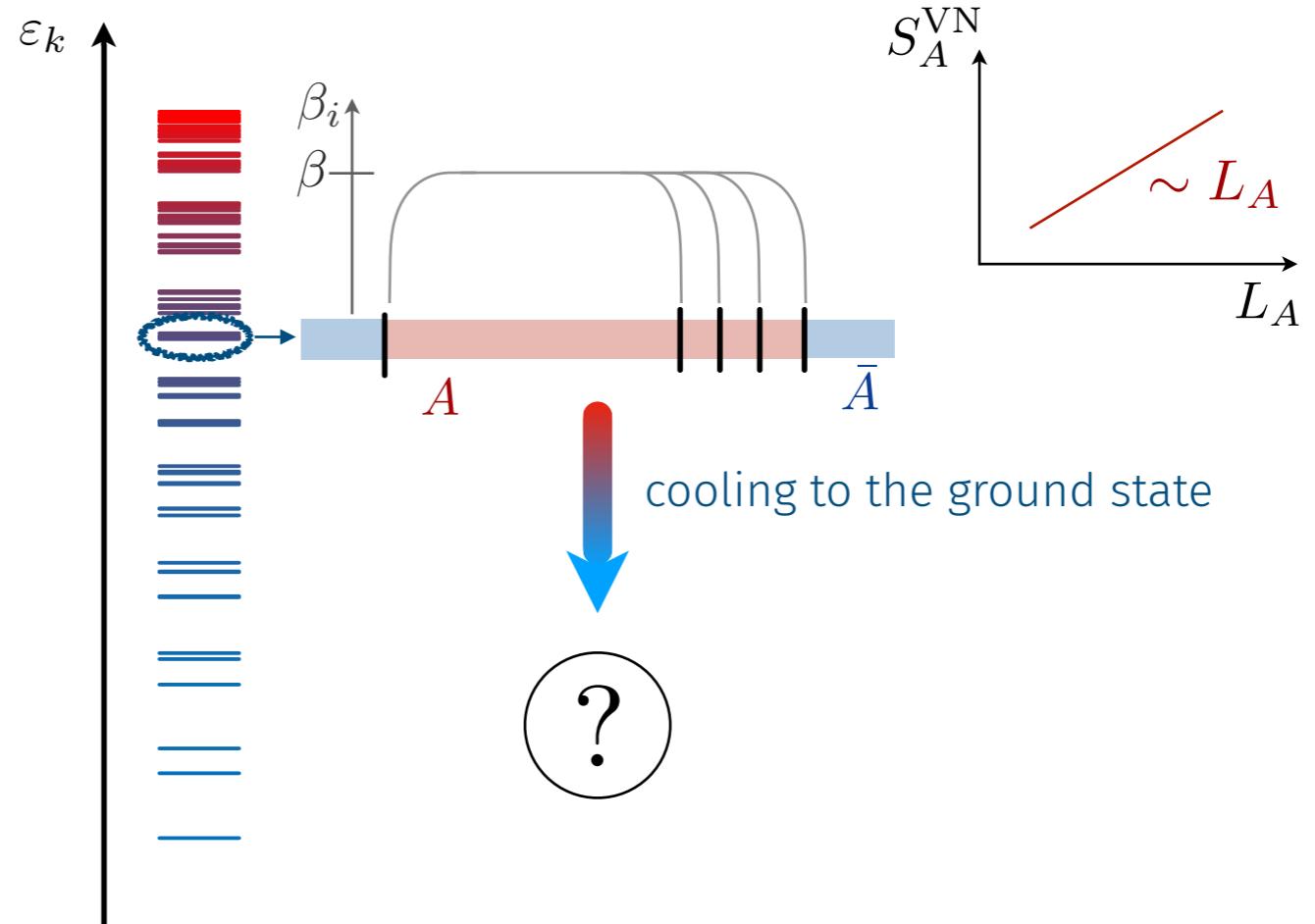
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Entanglement Hamiltonian & Eigenstate Thermalization Hypothesis

EH from CFT for ground state:
(at the critical point)

$$\rho_A = \frac{1}{Z} \exp \left[- \int_A dx \beta(x) \mathcal{H}(x) \right]$$

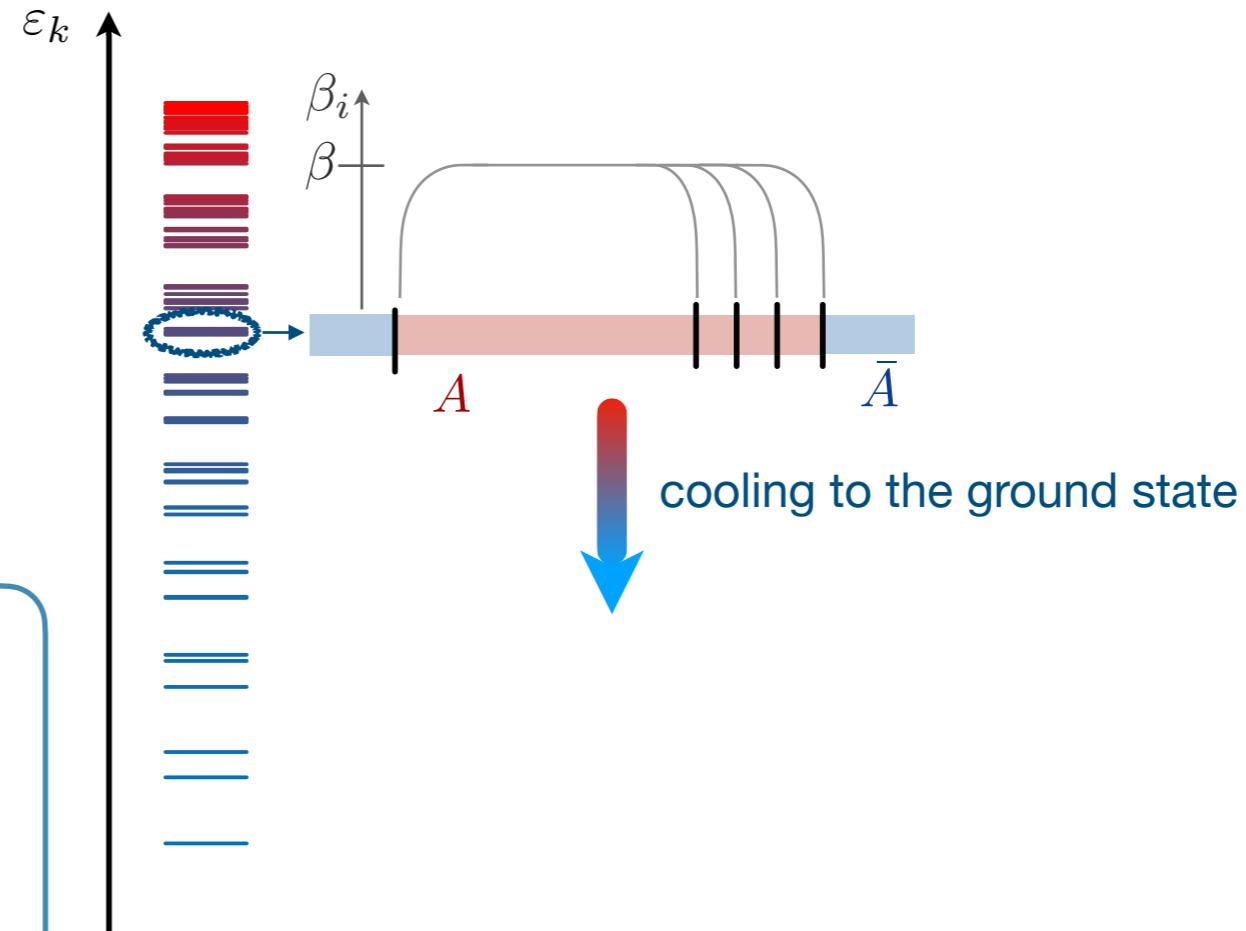
with

$$\beta(x) \propto \frac{L_A^2 - 4x^2}{L_A}$$

Parametrization as Gibbs state with *local inverse temperature*

$$\rho_A \sim e^{-\sum_{i \in A} \beta_i \hat{h}_i}$$

local temperature



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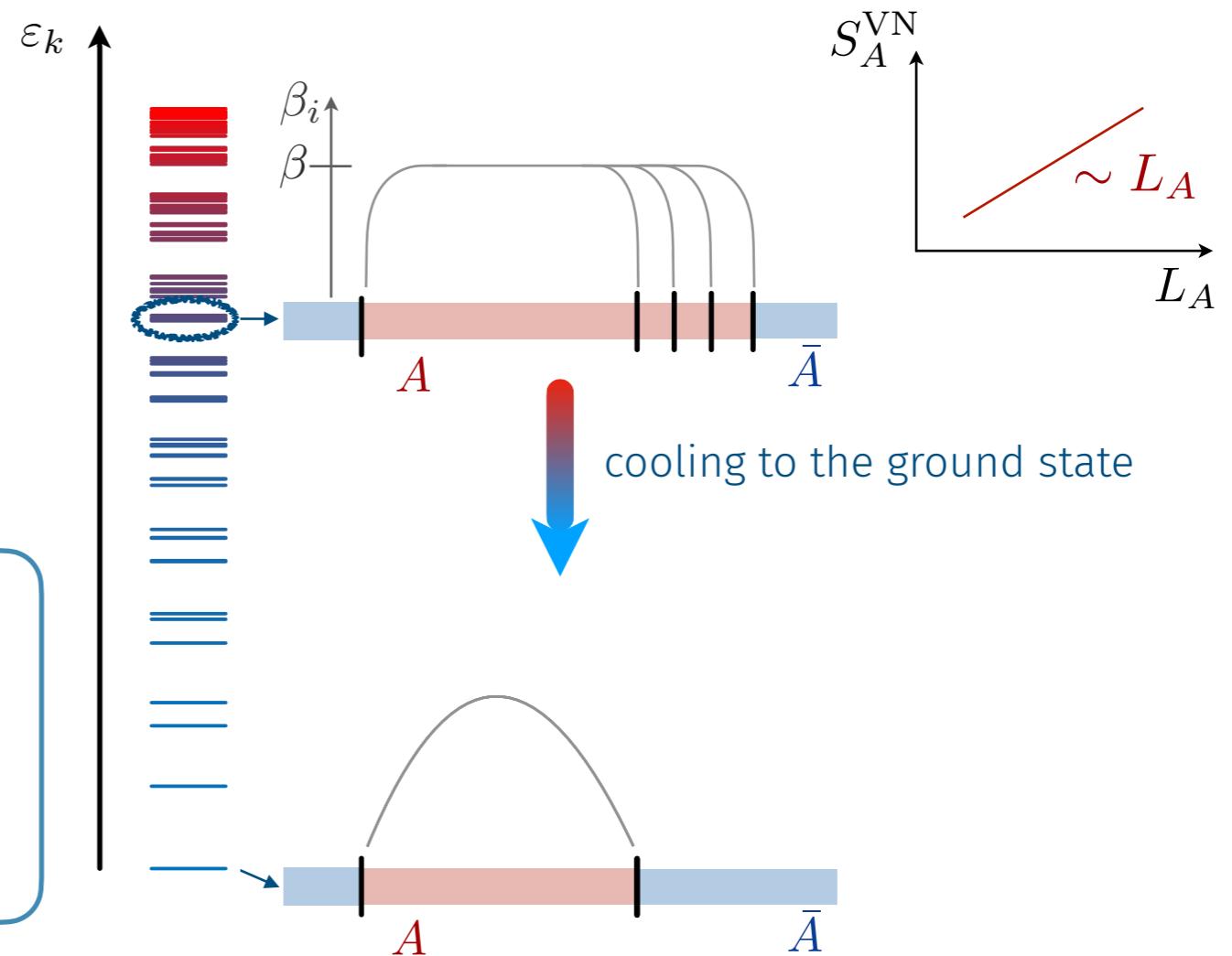
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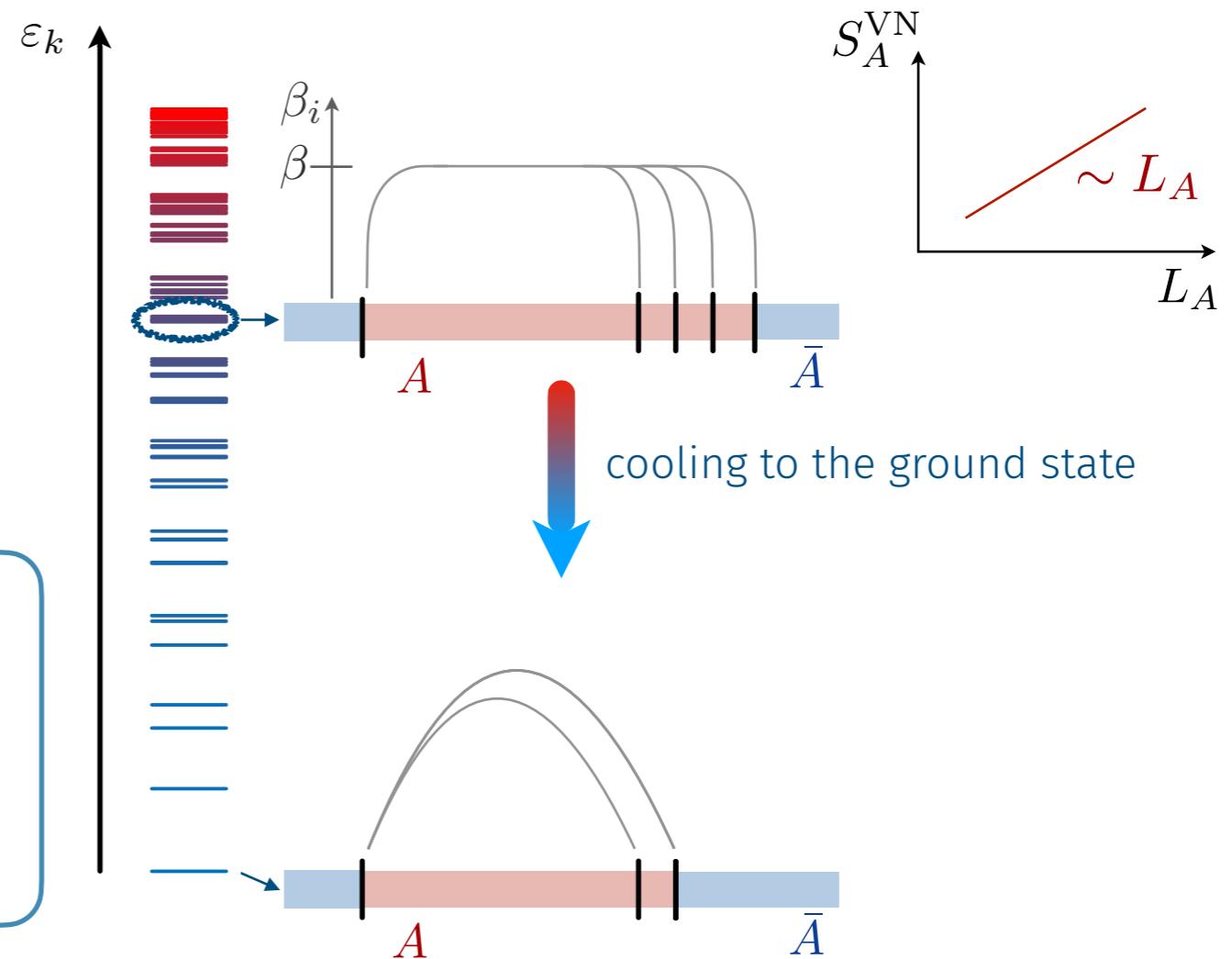
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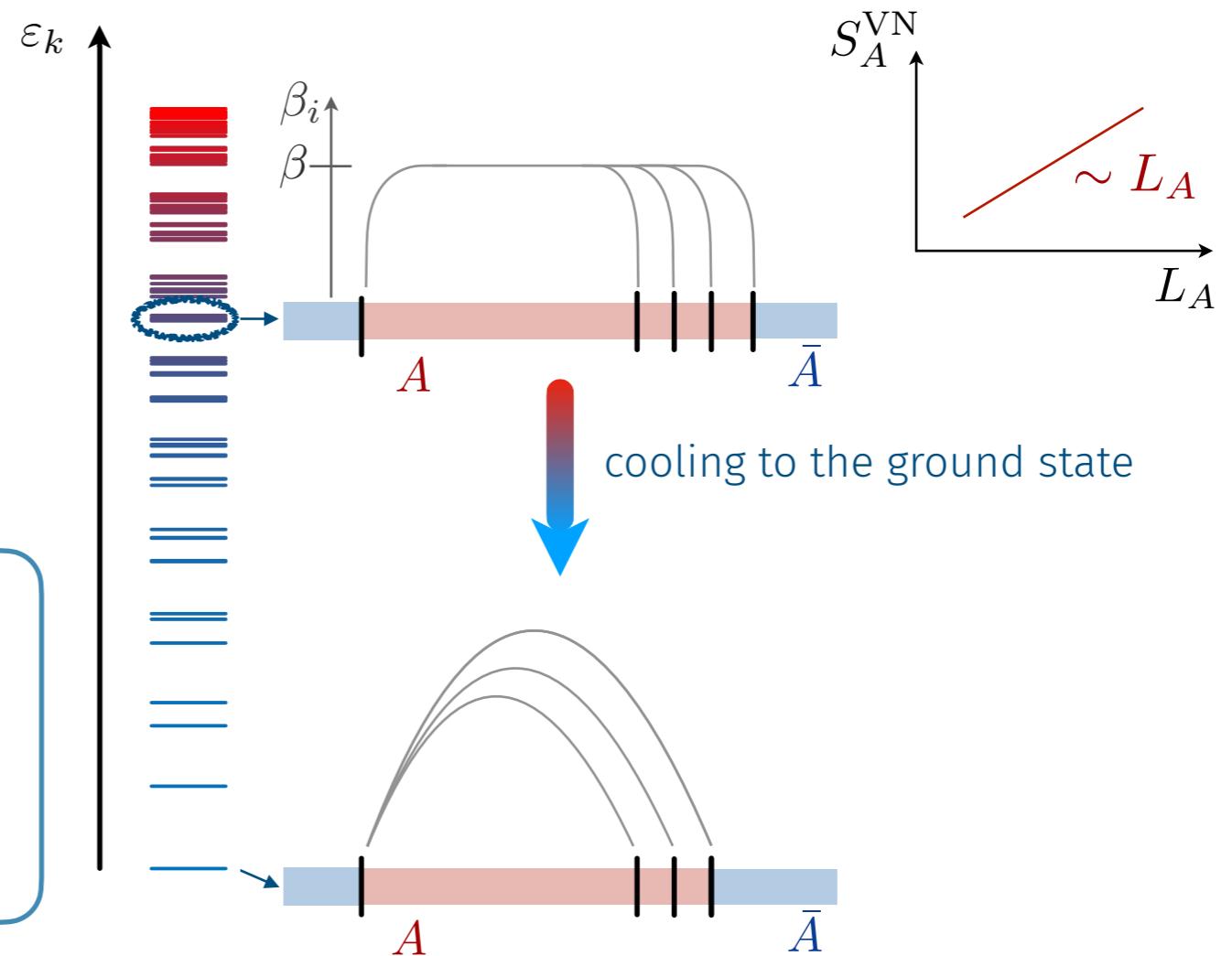
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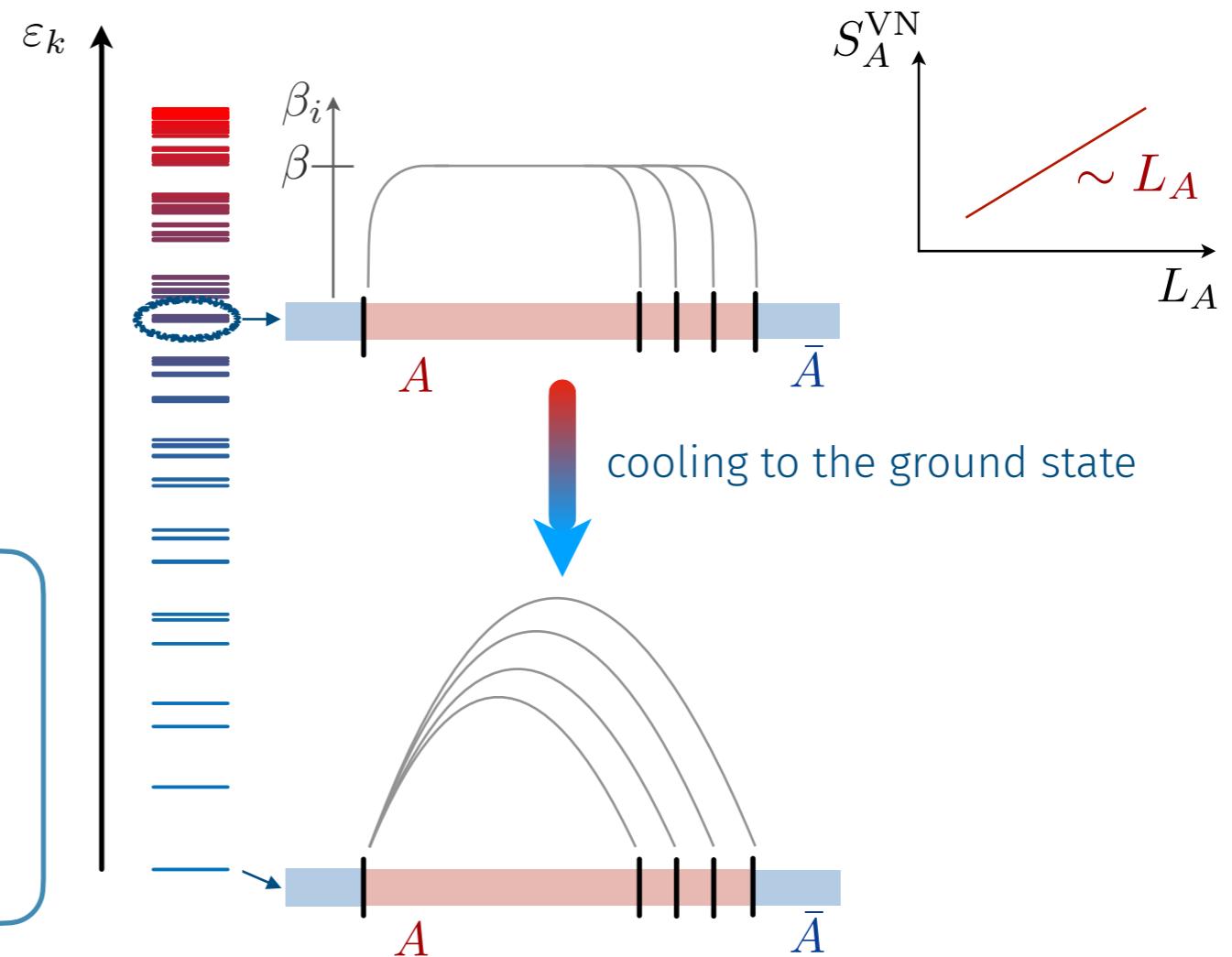
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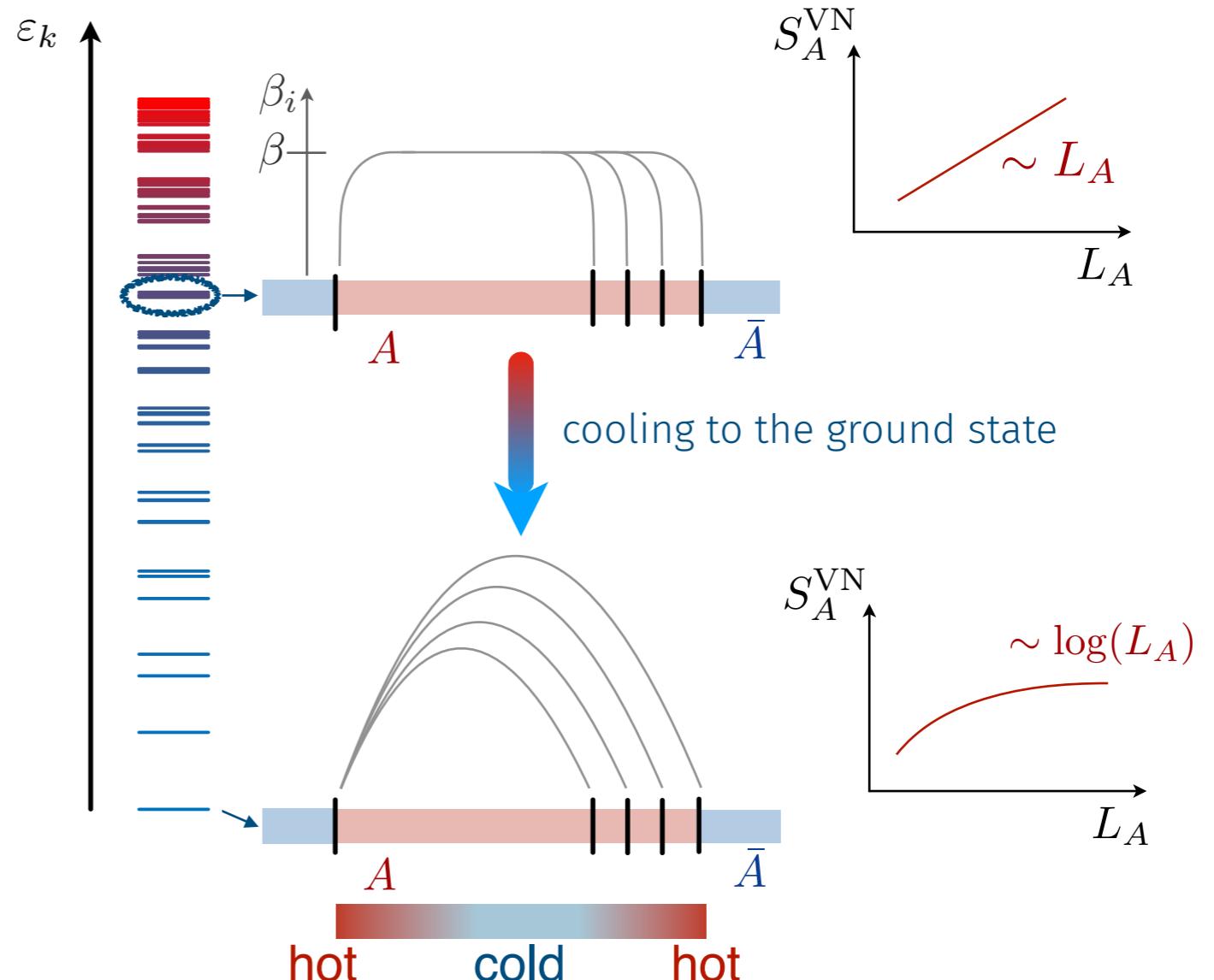
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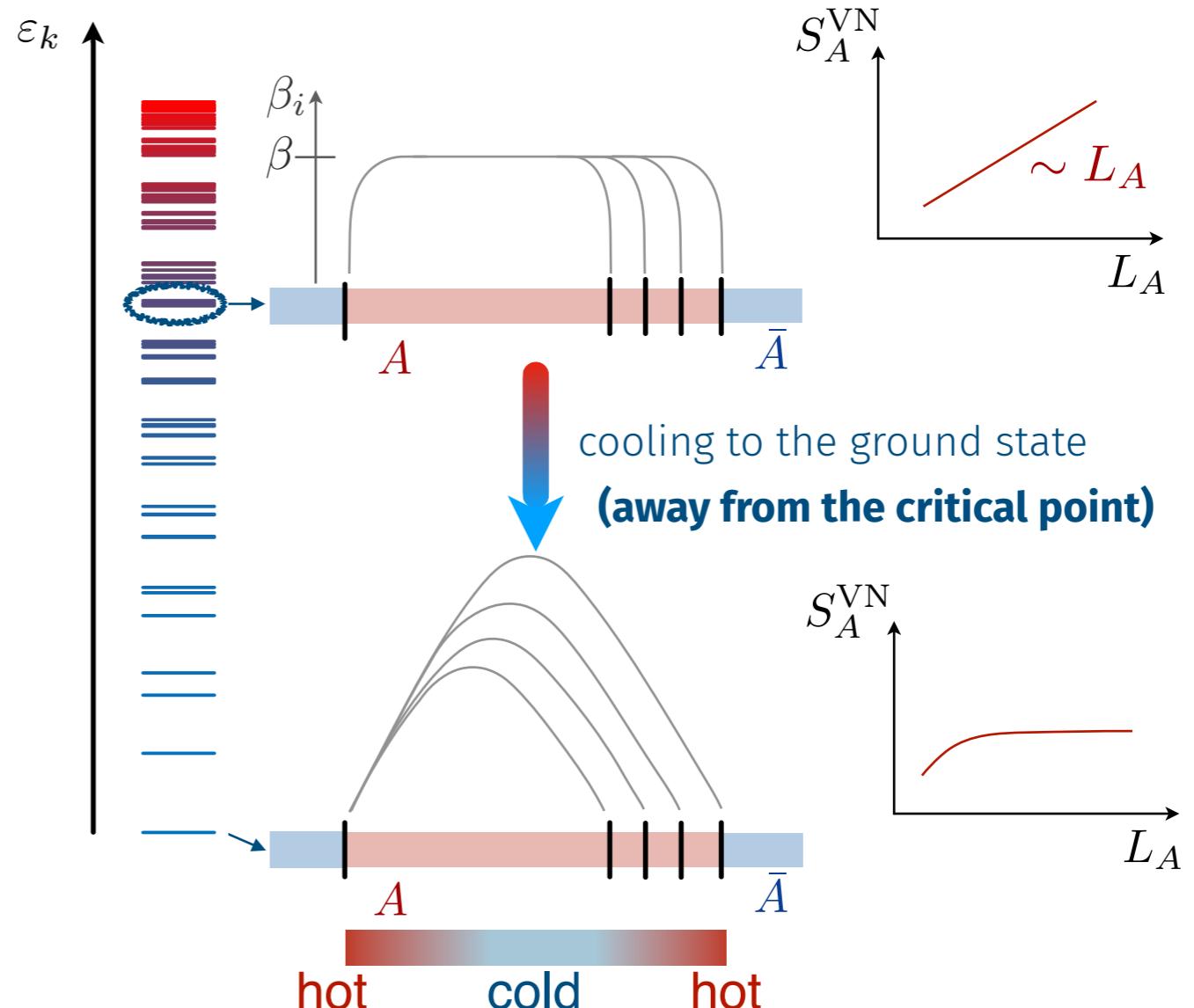
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local temperature profile



Viktor Eisler et al J. Stat. Mech. (2020) 103102

Casini, Huerta & Myers, JHEP, 2011(5), 1-41

Entanglement Hamiltonian & Eigenstate Thermalization Hypothesis

Example: XXZ model (51 sites)

$$\hat{H} = \frac{1}{2} \sum_i \left(\hat{S}_i^+ \hat{S}_{i+1}^- + \text{H.c.} \right) + \Delta \sum_i \hat{S}_i^z \hat{S}_{i+1}^z$$

Ansatz for the Entanglement Hamiltonian:

ferromagnet $c=1$ CFT antiferromagnet

$$\hat{\mathcal{H}}_A = \sum_{\ell} \beta_{\ell} \hat{h}_{\ell} \quad -1 \quad \Delta = 1$$

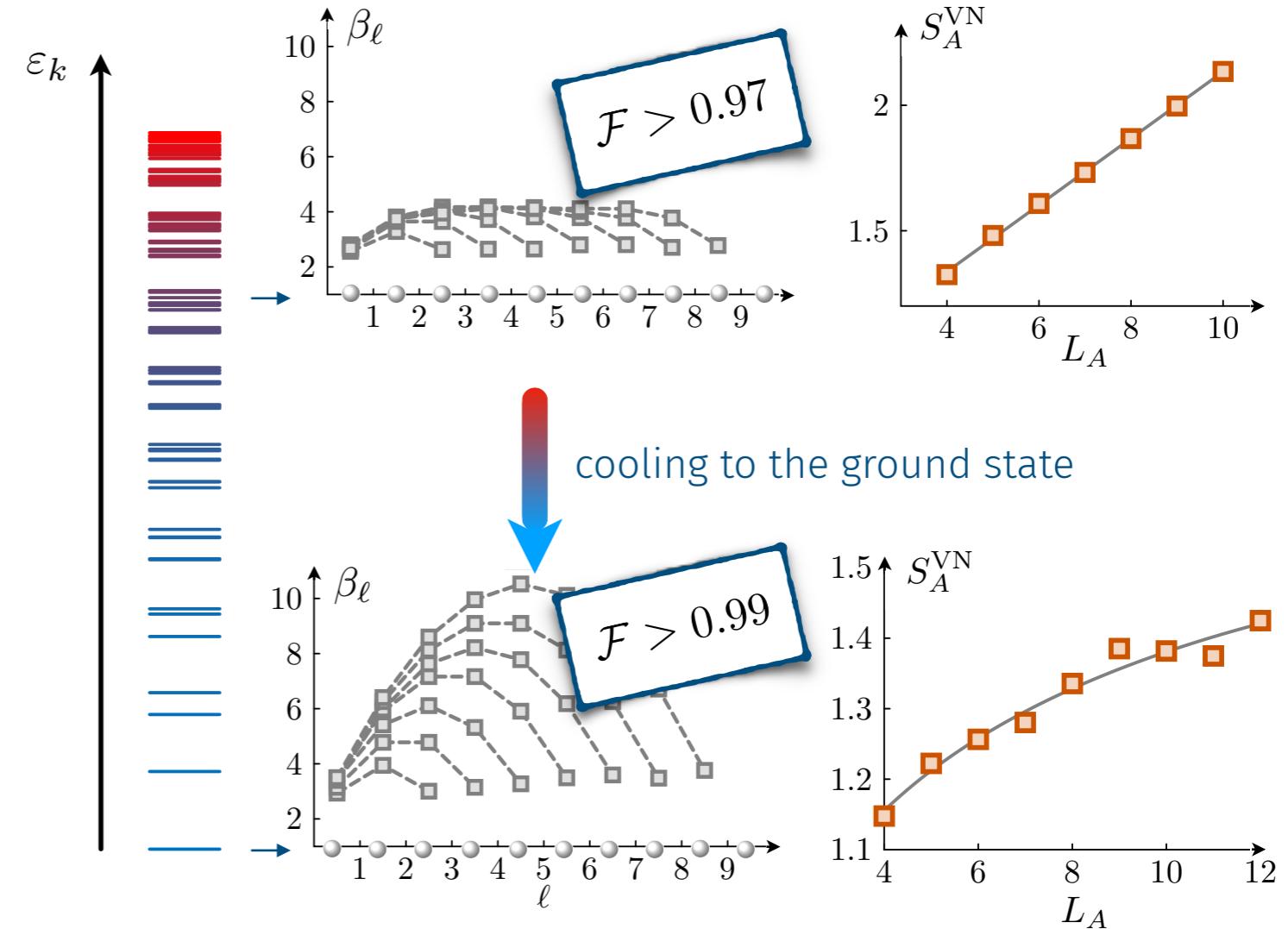
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Qi & Ranard Quantum 3, 159 (2019)

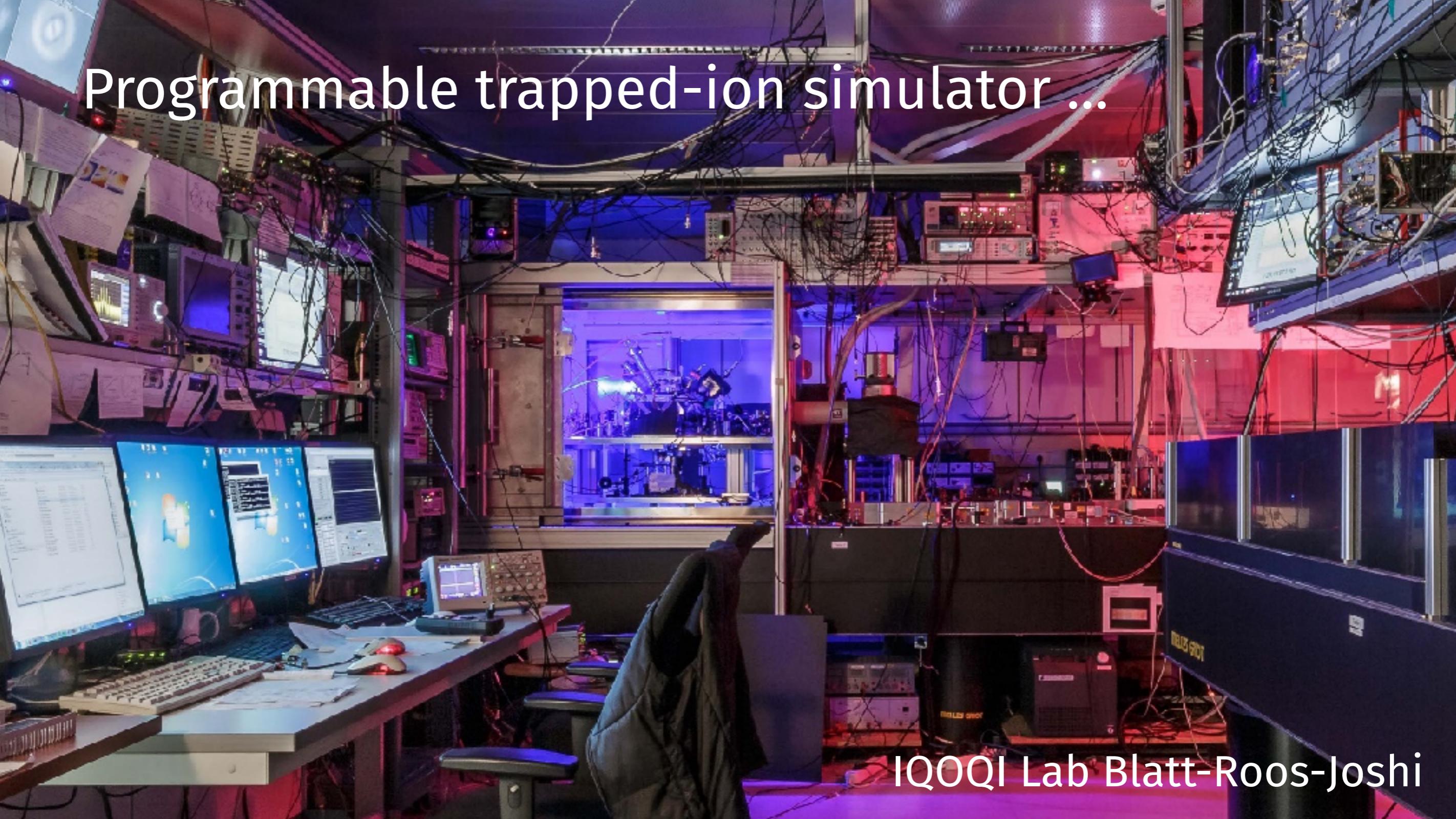
E. Bairey et.al. Phys. Rev. Lett. (2019)

W. Zhu et.al. Phys. Rev. B 99, 235109

C. Kokail et.al. Nat.Phys. 2021



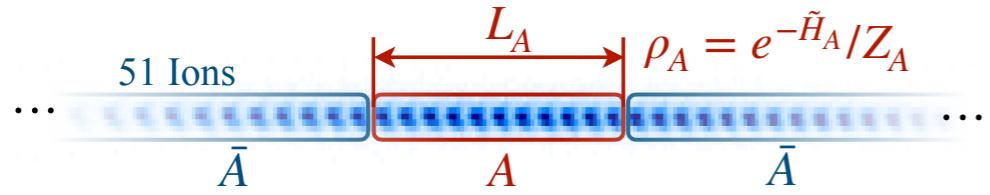
Programmable trapped-ion simulator ...



IQOQI Lab Blatt-Roos-Joshi

Results: Theory and Experiment

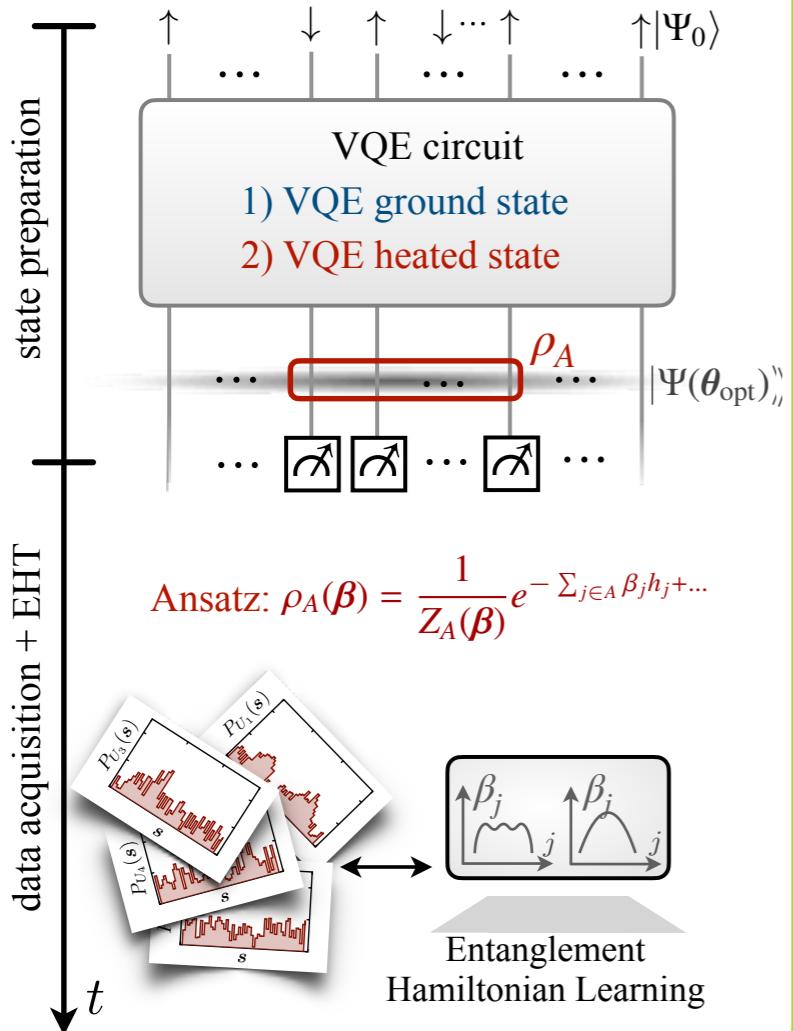
Heisenberg model



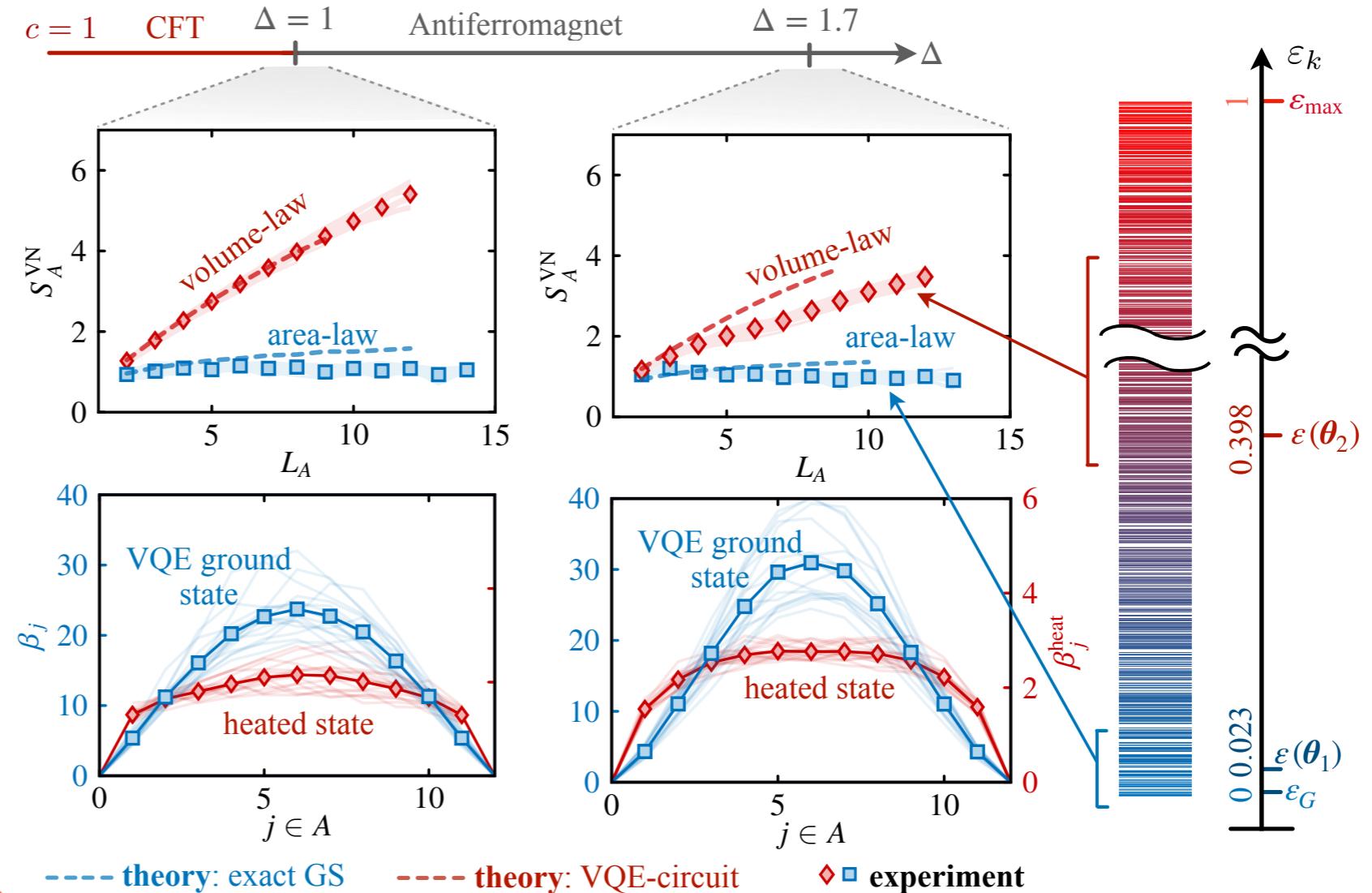
XXZ chain

$$H = J \sum_j (S_j^x S_{j+1}^x + S_j^y S_{j+1}^y + \Delta S_j^z S_{j+1}^z) = \sum_j h_j$$

State preparation & analysis



Entanglement properties

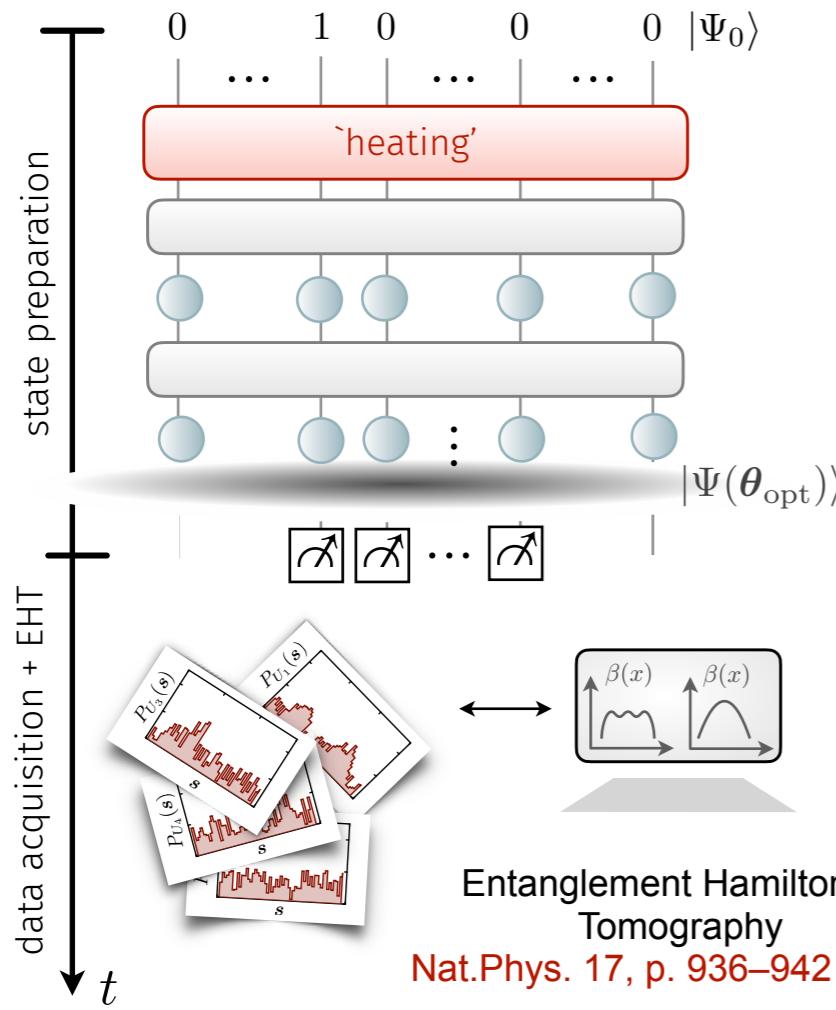


Scaling

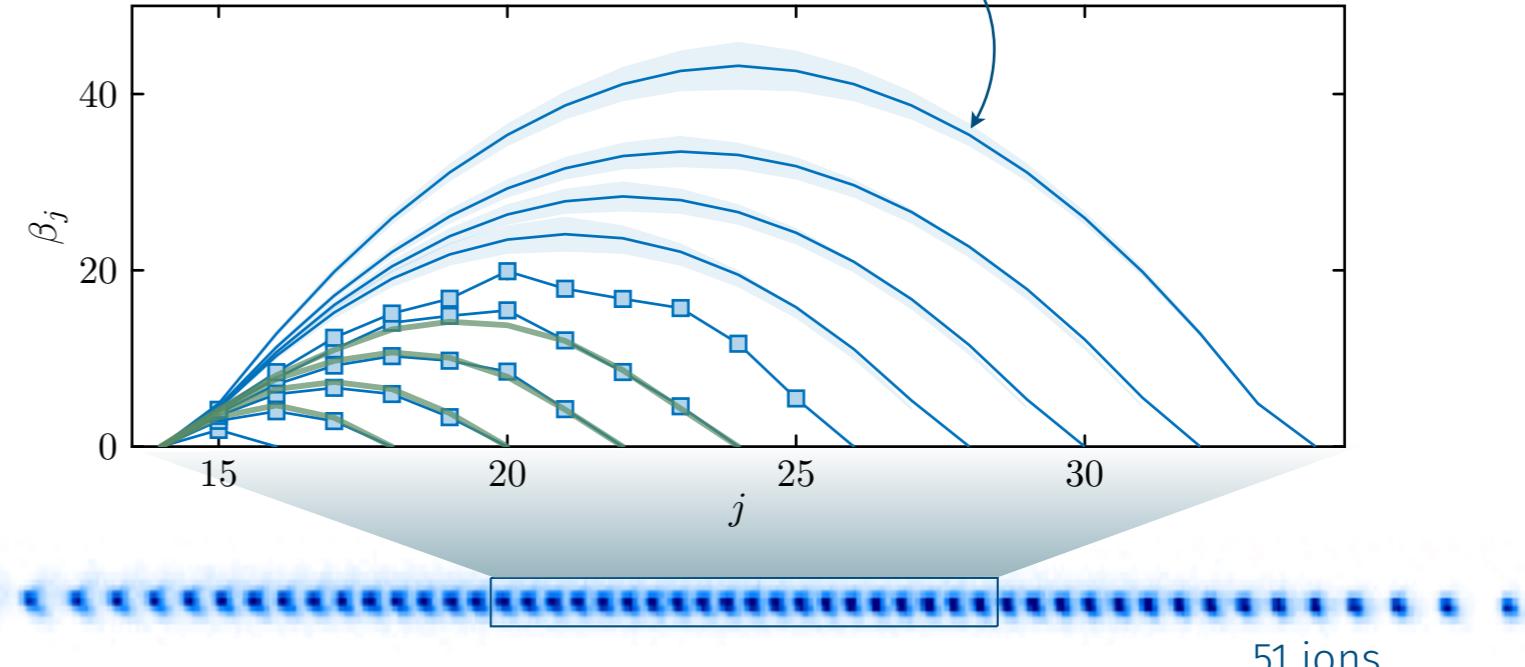
variational prep. of the XXZ GS:

$$\hat{H} = J \sum_{j=1}^L \left(\hat{S}_j^x \hat{S}_{j+1}^x + \hat{S}_j^y \hat{S}_{j+1}^y + \Delta \hat{S}_j^z \hat{S}_{j+1}^z \right) = \sum_{j=1}^L \hat{h}_j \quad L = 51$$

51 particles



Largest subsystem: $L_A = 20$ sites



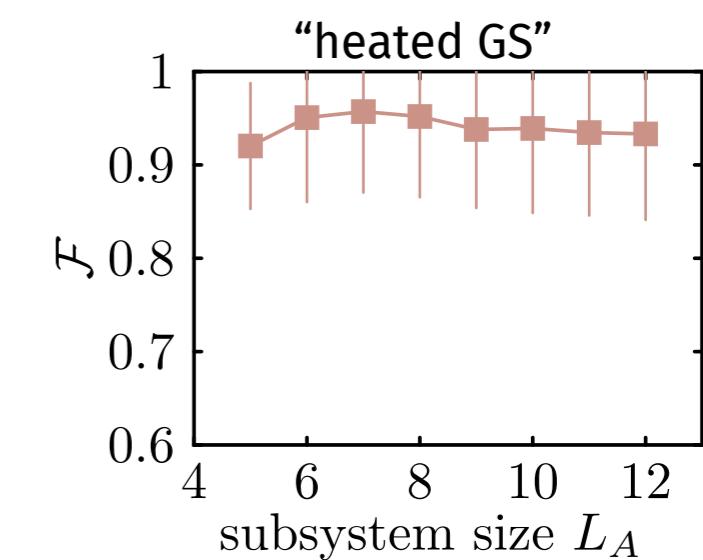
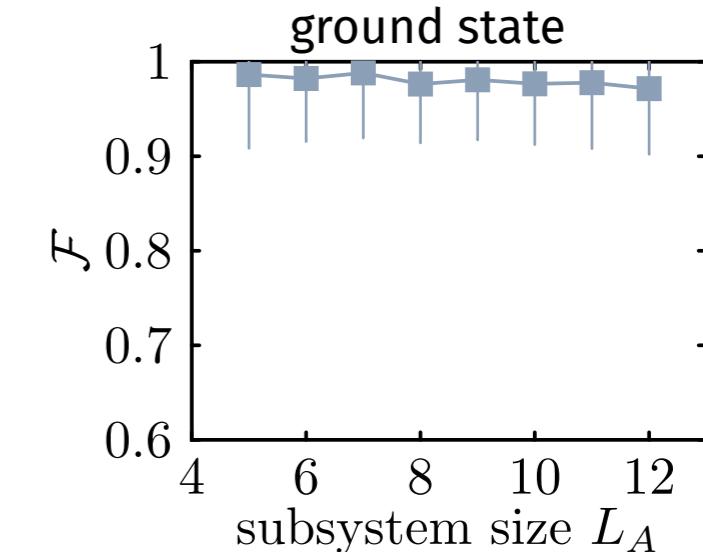
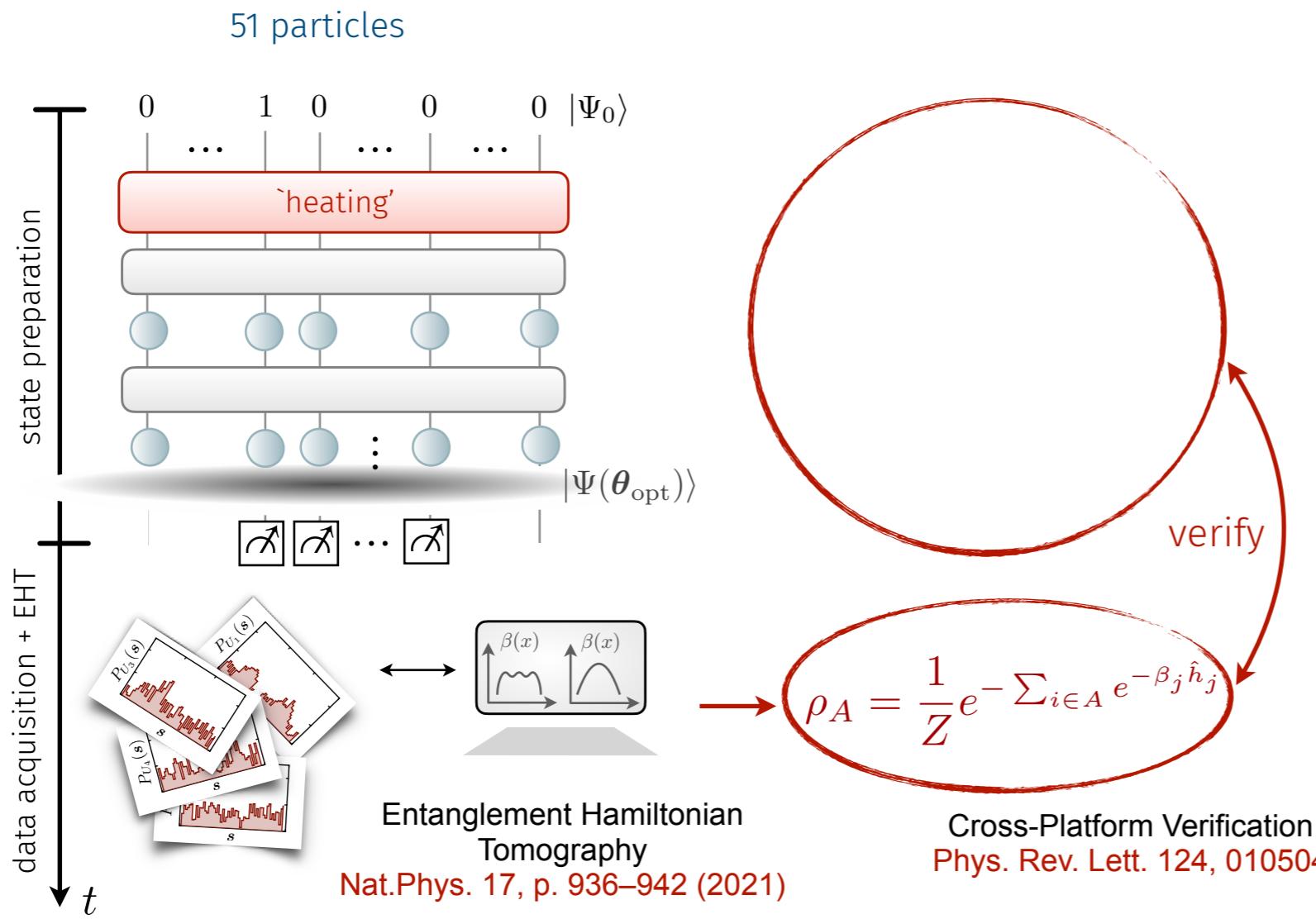
Entanglement Hamiltonian
Tomography

Nat.Phys. 17, p. 936–942 (2021)

Verification of Entanglement Hamiltonian Tomography

variational prep. of the XXZ GS:

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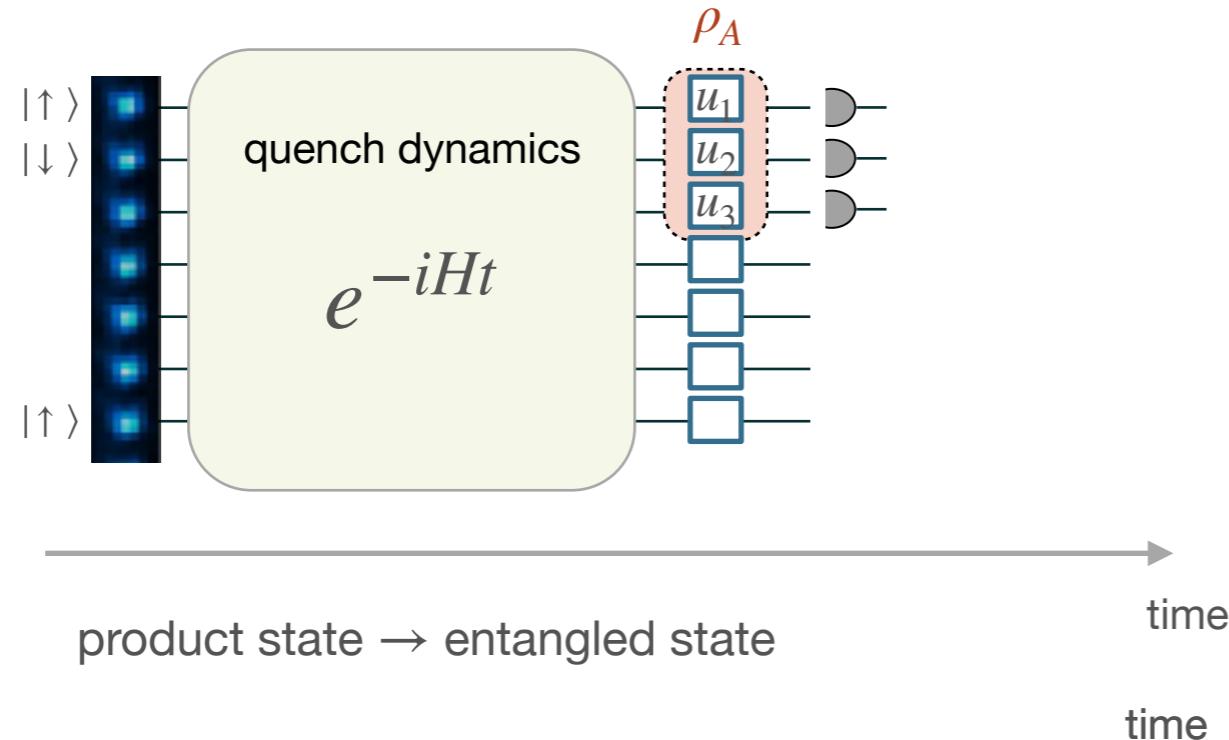
Details of *Entanglement Hamiltonian Learning*

C. Kokail, R. van Bijnen, A. Elben, B. Vermersch, & PZ, *Entanglement Hamiltonian Tomography in Quantum Simulation*, Nat. Phys. (2021).

A. Anshu, S. Arunachalam, T. Kuwahara, and M. Soleimanifar, *Sample-Efficient Learning of Interacting Quantum Systems*, Nat. Phys. (2021).

Randomized Measurements: Tomography

Quench dynamics with analog quantum simulator



Randomized Tomography

$$\rho_A = \mathbb{E}_{U \sim \text{CUE}}[\hat{\rho}_A]$$

exponentially expensive

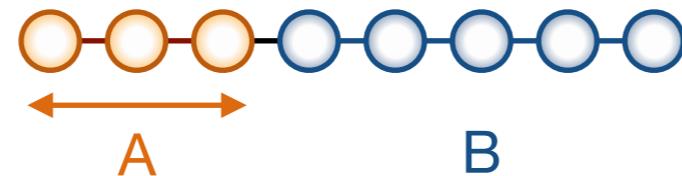


$$\hat{\rho}_A = \sum_{\mathbf{s}, \mathbf{s}'} \sum_U P_U(\mathbf{s}) (-2)^{-D[\mathbf{s}, \mathbf{s}']} U |\mathbf{s}'\rangle \langle \mathbf{s}'| U^\dagger$$

tomographically complete

Measuring (Large-Scale) Entanglement

Protocol 0: Quantum State Tomography



data

$$\rho_A$$

✓ expensive* $\sim \text{rank}(\rho_A) 2^{N_A}$ (scales exponentially)

sample-efficient entanglement
Hamiltonian tomography

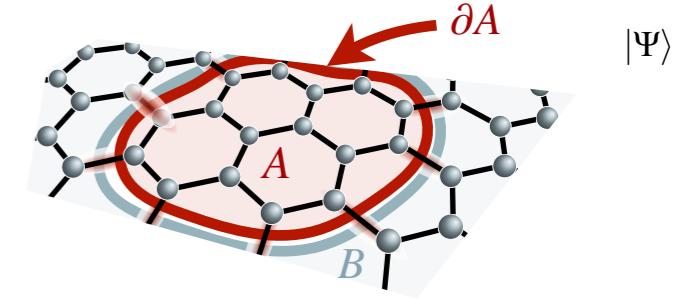
* tomography can be made 'more efficient' if we know something about the quantum state: MPS, low rank, neural network, ...

Classical Shadows

* or, we are only interested in certain functionals of ρ_A , e.g. expectation values $\langle O \rangle = \text{Tr } O_A \rho_A$

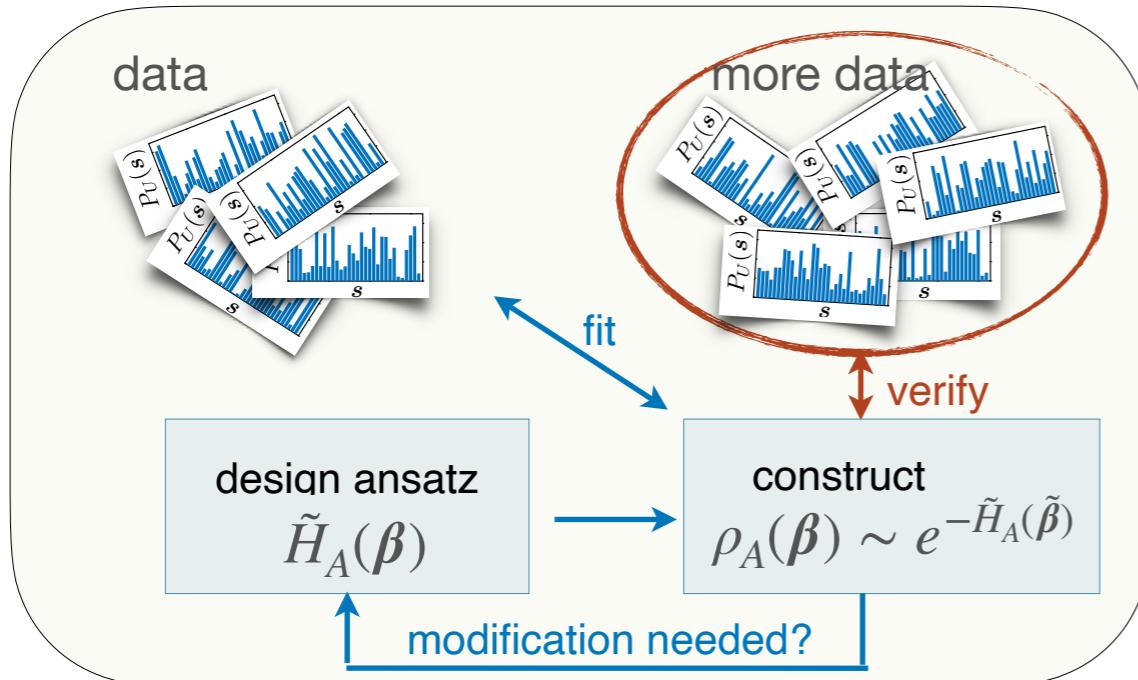
Sample-Efficient Learning of the Entanglement Hamiltonian (EH)

Protocol: efficient parametrization of EH



data $\longrightarrow \rho_A = e^{-\tilde{H}_A(\beta)}$ with $\tilde{H}_A(\beta) = \sum_{i \in A} \beta_i \hat{h}_\ell + \dots$ polynomial # β_i ?

Gibbs state simple operator structure



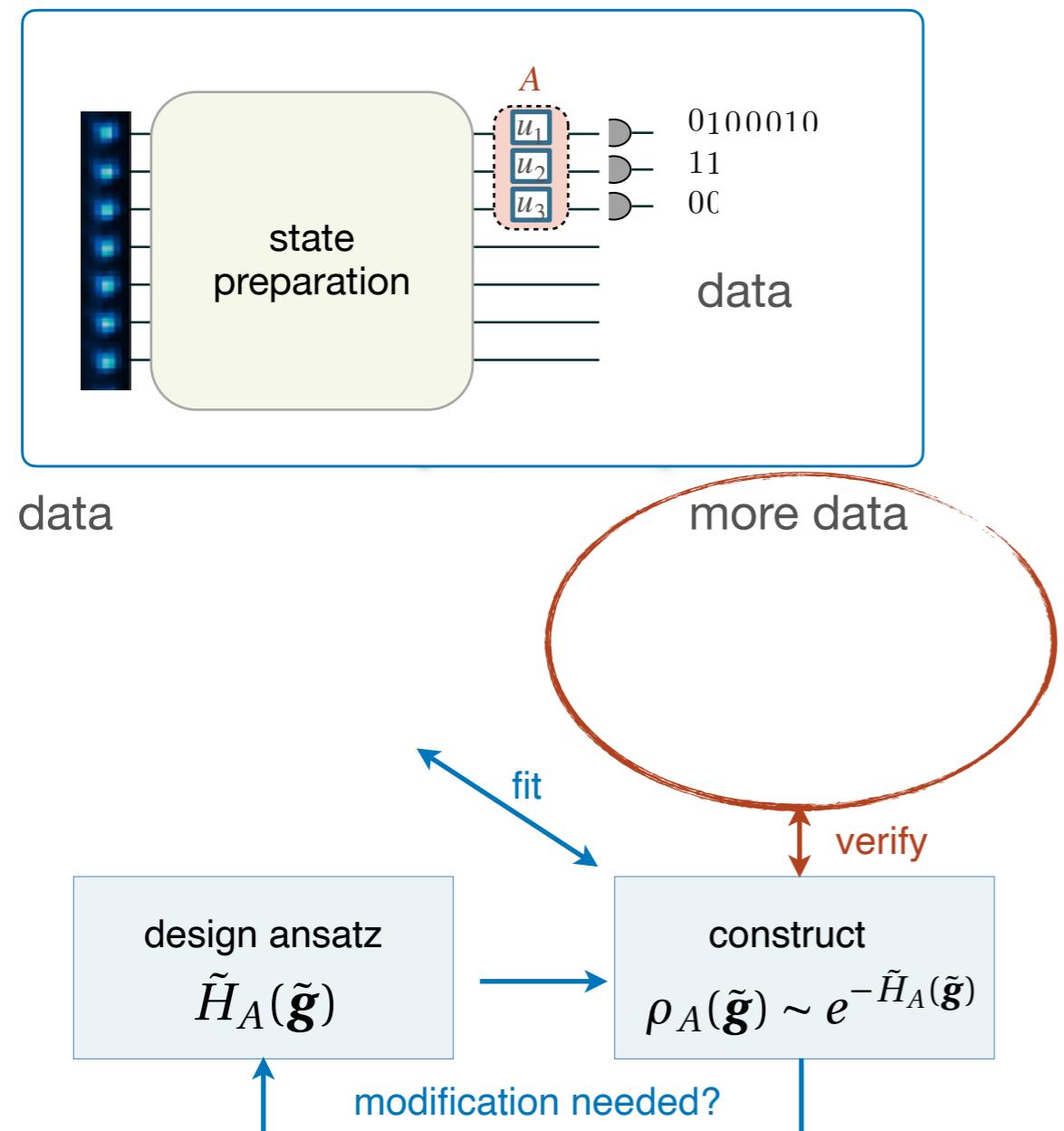
measurement protocol

- sample complexity
- time efficiency

C. Kokail, R. van Bijnen, A. Elben, B. Vermersch, & PZ,
Entanglement Hamiltonian Tomography in Quantum Simulation,
Nat. Phys. (2021).

A. Anshu, S. Arunachalam, T. Kuwahara, and M. Soleimanifar,
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Nat. Phys. (2021).

Learning the Entanglement Hamiltonian



Learning Protocol

- Measure experimental frequencies:

$$P_U(\mathbf{s}) = \text{Tr} \left(\mathbf{U} \rho_A \mathbf{U}^\dagger |\mathbf{s}\rangle \langle \mathbf{s}| \right)$$

- Ansatz for Entanglement Hamiltonian:

$\tilde{H}_A(\tilde{\mathbf{g}})$ • e.g. deformation of system Hamiltonian plus corrections

- Fit optimal parameters $\tilde{\mathbf{g}}$ by minimizing the distance to the frequencies

$$\chi^2(\tilde{\mathbf{g}}) = \sum_{U,\mathbf{s}} \left[\text{Tr} \left(\mathbf{U} |\mathbf{s}\rangle \langle \mathbf{s}| \mathbf{U}^\dagger \frac{e^{-\tilde{H}_A(\tilde{\mathbf{g}})}}{Z(\tilde{\mathbf{g}})} \right) - P_U(\mathbf{s}) \right]^2$$

- Verify by measuring Hilbert-Schmidt fidelities

$$\mathcal{F} \sim \text{Tr} [\rho_A^{\text{data}} \rho_A^{\text{more data}}] = \dots$$

A. Elben et. al. PRL (2020)

EHT for the Ground state of a long-range Ising chain (Theory)

System Hamiltonian

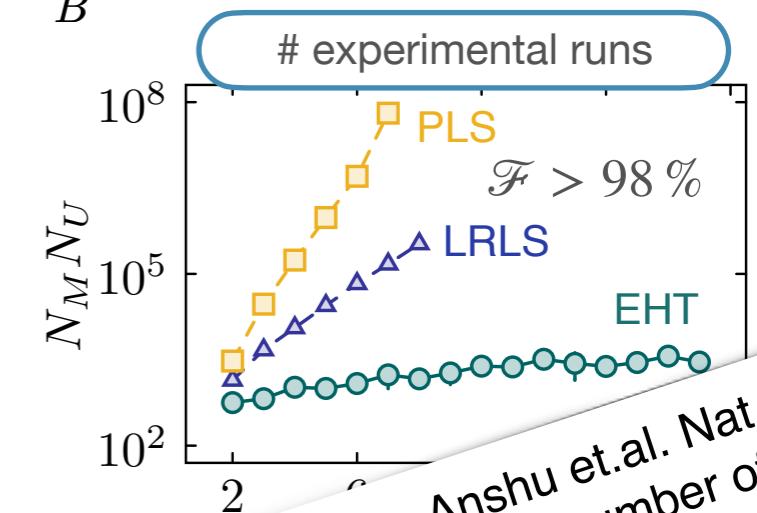
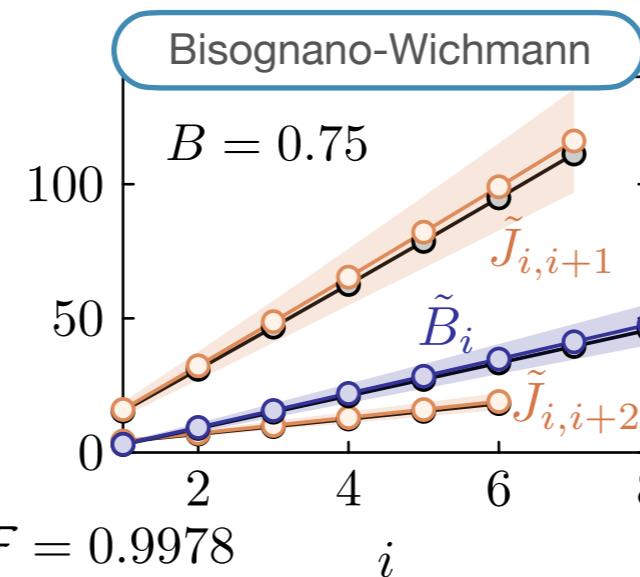
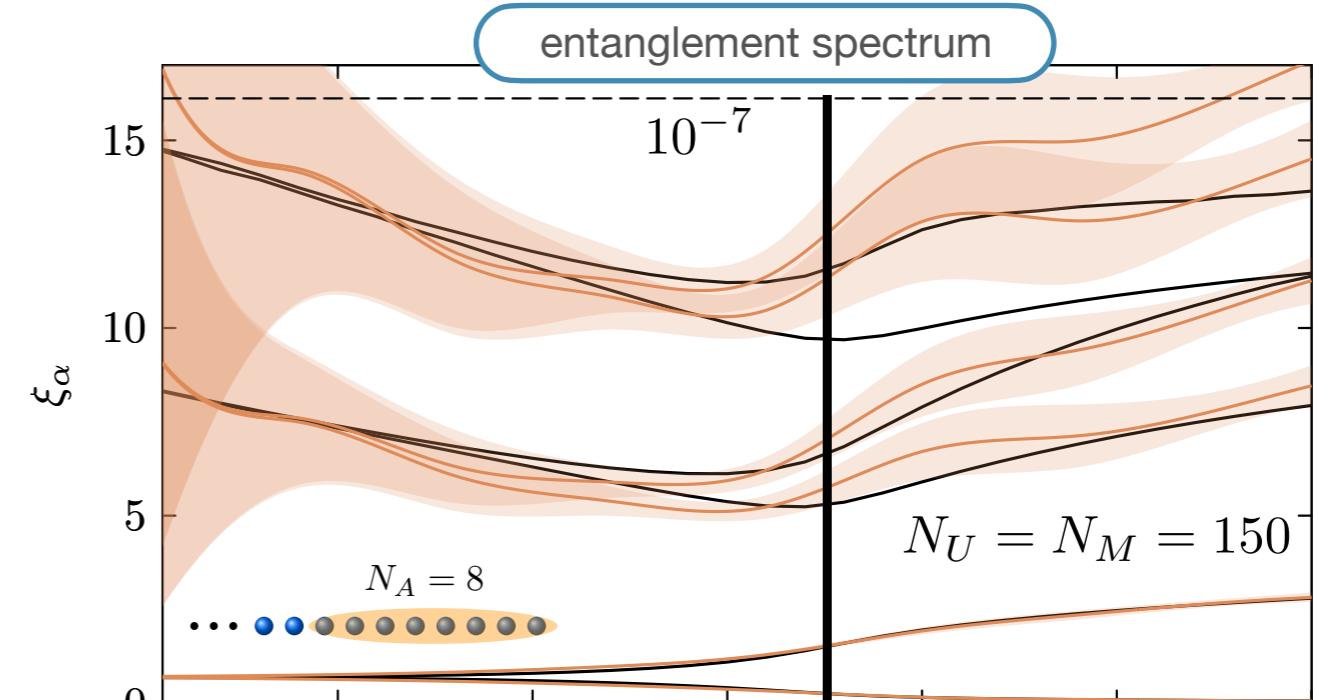
$$H = \sum_{i,j>i} \frac{J_0}{|i-j|^\alpha} \sigma_i^x \sigma_j^x + B \sum_i \sigma_i^z$$

$$\alpha = 2.5$$

Ansatz for Entanglement Hamiltonian

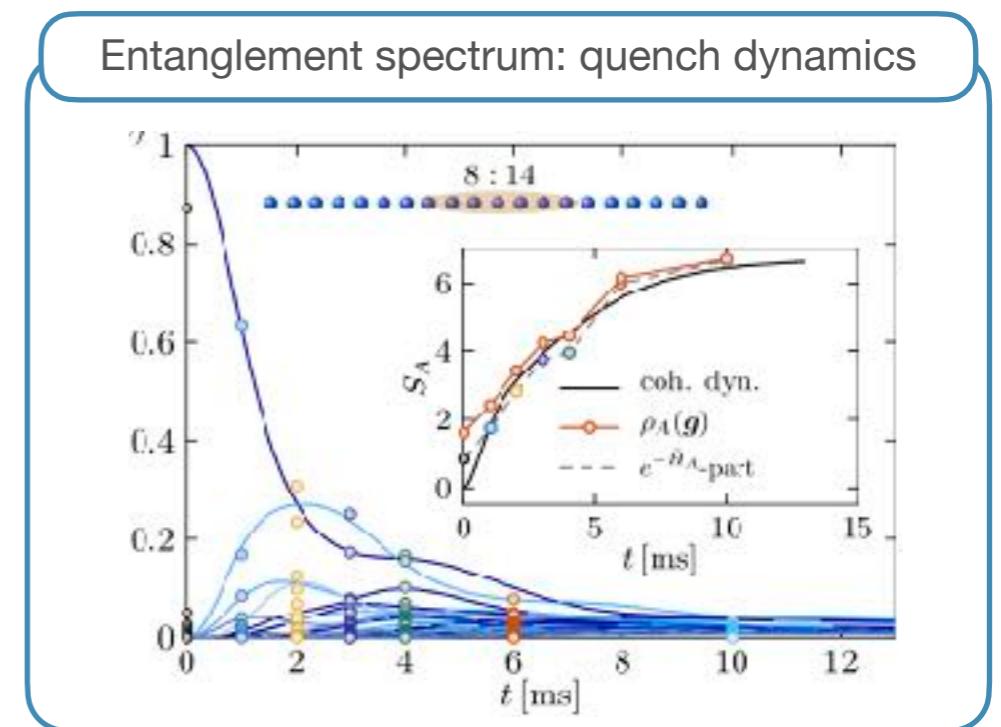
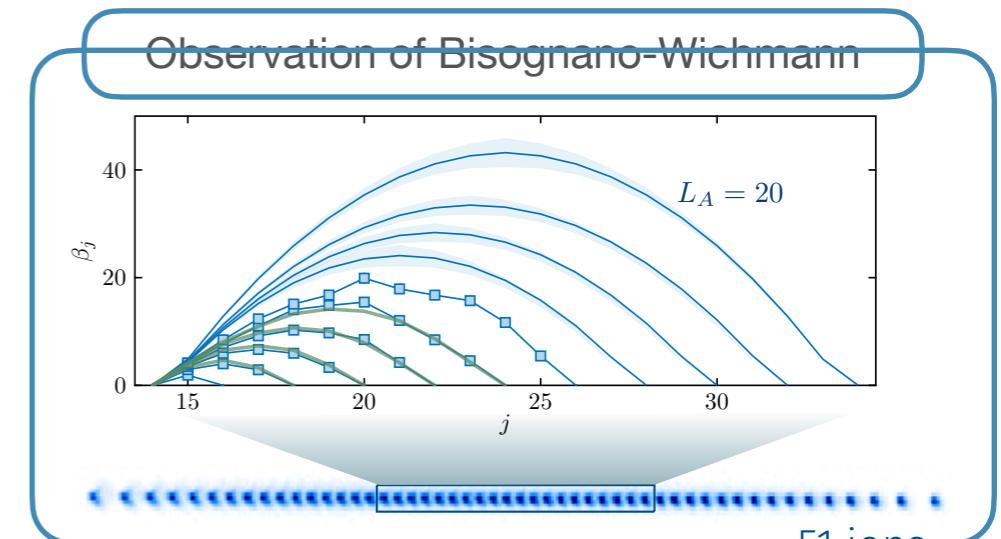
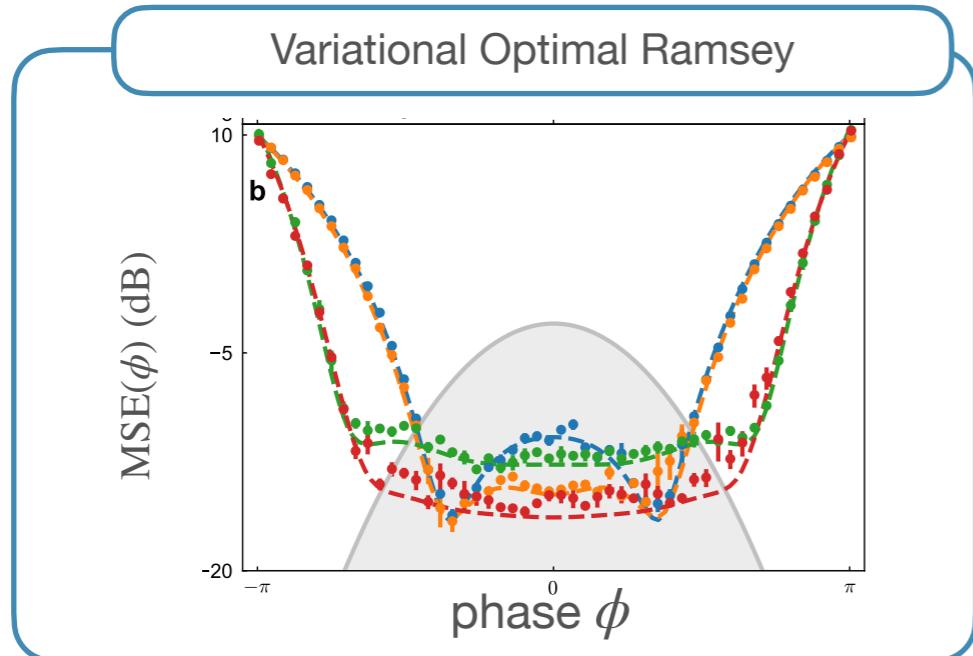
We choose a simple deformation of the system Hamiltonian

$$\tilde{H}_A = \sum_{i,j \in A} \tilde{J}_{ij} \sigma_i^x \sigma_j^x + \sum_{i \in A} \tilde{B}_i \sigma_i^z$$



Conclusions & Outlook

- Programmable Quantum Simulators with Atoms
- Hybrid Classical-Quantum / Variational Algorithms
- Randomized Measurements Toolbox
- Programmable Quantum Sensors



The Team

Theory:



C. Kokail



R. van Bijnen



T Zache



P. Zoller

Experiment:



M. Joshi



F. Kranzl



C. Roos



R. Blatt