

Single-shot quantum measurements sketch quantum many-body states

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Quantum measurements allow us to observe quantum many-body systems consisting of a multitude of microscopic degrees of freedom. However, the quantum uncertainty and the exponentially large Hilbert space pose natural barriers to simple interpretations of the quantum measurement outcomes. We propose a nonlinear “measurement energy” based upon the measurement outcomes and a general approach akin to quantum machine learning to extract the most probable states (maximum likelihood estimates), naturally reconciling noncommuting observables and getting more out of the quantum measurements. Compatible with established quantum many-body ansatzes and efficient optimization, our strategy offers state-of-art capacity with control and full information. We showcase the versatility and accuracy of our strategy on random long-range fermion and Kitaev quantum spin-liquid models, where smoking-gun signatures were lacking.

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Introduction. Quantum many-body systems exhibit fascinating yet elusive quantum phenomena, such as quantum fluctuations, strong correlations [1], quantum entanglements [2–9], and quantum anomalies [10–15], with no counterpart in the macroscopic world [16]. For example, nontrivial spin and electronic systems such as quantum spin liquids (QSLs) [17–20], superconductors [21–24], and topological phases [11,12,25–33], form a modern-day scientific cornerstone. While scientists have made much progress and established physical pictures that are simple and beautiful, it is common that we scratch our heads over their complex behaviors when encountering the vast and intertwined microscopic or emergent degrees of freedom [34,35].

Experiments on quantum many-body systems are our window into their microscopic worlds. However, analysis of quantum measurements is intrinsically difficult due to quantum fluctuations that whenever a general observable $\hat{O} = \sum_{\tau} a_{\tau} \hat{P}_{\tau}$ is measured, the outcome stochastically picks one eigenvalue a_{τ} with probability $\langle \hat{P}_{\tau} \rangle$, where \hat{P}_{τ} is the projection operators corresponding to the eigenvalue a_{τ} [36]. Fortunately, if we measure the target state repeatedly, through either identical copies or relaxation, the resulting average converges to a nonstochastic and more physically interpretable expectation value $\langle \hat{O} \rangle$ [36]. We may further facilitate the investigation with a phenomenological picture or microscopic model, whose predictions offer smoking-gun signatures that we can compare with the quantum measurements. However, by presuming a model or picture, we not only waste seemingly unrelated data but also risk biases consciously or unconsciously. In addition, exotic quantum matters such as QSLs lack definitive signatures, compelling scientists to resort to a negative-evidence stance [19,37] that may remain controversial and less controlled to a degree.

In this Letter, we discuss a general strategy to determine the most probable quantum many-body states given the quantum measurement data. We interpret the quantum measurements as nonlinear measurement energy and offer an iterative effective-Hamiltonian strategy to obtain the measurement outcomes’ maximum likelihood estimate (MLE) states in the Hilbert space, which in turn provide us with all information, including those unachievable directly, such as quantum entanglements [2–9] and topological characters [7–11]. In this way, we can utilize all measurement outcomes on a neutral and equal footing and remove the necessity of any presumed model or picture. We showcase the strategy’s generality and effectiveness on random long-range fermion and Kitaev spin-liquid models [18], which lack a smoking-gun signature for quantum measurements. Especially, our strategy can work wonders even for complex states such as the disordered Kitaev QSL even with only nonrepeating single-shot quantum measurements, fully capturing its non-Abelian topological degeneracy (Fig. 4). Indeed, every single-shot quantum measurement matters, as its outcome carries information. On the other hand, quantum state reconstruction through measurements, often named quantum state tomography, has been a long-standing topic in quantum physics [38]. The recent introduction of neural network quantum state tomography (NNQST) [39,40] and shadow tomography [41] has achieved practical efficiency over multiple qubits. In comparison, our strategy provides the full quantum states and even the topologically degenerate ground-state manifold, complementing shadow tomography, which estimates feasible physical quantities. Also, owing to exceptional optimization efficiency [42] and compatibility with various quantum many-body ansatzes, including the tensor network states and neural network states [43] (that NNQST is based on), our strategy offers state-of-art tomography capacity with control and full information. Further, unlike the previous tomography based on computational basis, our approach is more compatible with physical observables, applicable to a broader range of experiments.

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The measurement energy. Consider the *a priori* probability distribution $p(\Phi)$ of all quantum states $|\Phi\rangle$ spanning the Hilbert space, if a single-shot measurement of observable $\hat{O} = \sum_{\tau} a_{\tau} \hat{P}_{\tau}$ yields an outcome, which is labeled as event γ . The posterior probability after this measurement (event) is

$$p(\Phi|\gamma) = p(\gamma|\Phi)p(\Phi)/p(\gamma), \quad (1)$$

where $p(\gamma|\Phi) = \langle \Phi | \hat{P}_{\gamma} | \Phi \rangle$ is the probability of γ given the quantum state $|\Phi\rangle$, \hat{P}_{γ} is the projection operator corresponding to event γ , and $p(\gamma)$ offers normalization [44].

As the measurements progress, we obtain a series of results $\mathcal{D} = \{\gamma_1, \gamma_2, \dots\}$ of single-shot measurements over observables $\{\hat{O}_1, \hat{O}_2, \dots\}$, and update the probability as

$$p(\Phi|\mathcal{D}) \propto \prod_{\gamma \in \mathcal{D}} p(\gamma|\Phi) = \prod_{\gamma \in \mathcal{D}} \langle \Phi | \hat{P}_{\gamma} | \Phi \rangle. \quad (2)$$

We define the ‘‘measurement energy’’ [45],

$$E(\Phi|\mathcal{D}) = - \sum_{\gamma \in \mathcal{D}} \log \langle \Phi | \hat{P}_{\gamma} | \Phi \rangle, \quad (3)$$

so that $p(\Phi|\mathcal{D}) \propto \exp[-E(\Phi|\mathcal{D})]$ becomes analogous to a Boltzmann distribution with energy $E(\Phi|\mathcal{D})$ in units of $k_B T$. The measurement energy also responds to the negative logarithm of the likelihood function in MLE studies [46–52]. We will show a protocol to locate the MLE states with minimum $E(\Phi|\mathcal{D})$.

The statistical meaning of Eq. (3) becomes clear in the case of multiple measurements $N_{\hat{O}}$ on the same observable \hat{O} , yielding N_{τ} instances of a_{τ} outcomes. By binning them together, we reexpress the measurement energy as

$$E(\Phi|\mathcal{D}) = - \sum_{\hat{O}} \sum_{\tau} N_{\hat{O}} f_{\tau} \log \langle \Phi | \hat{P}_{\tau} | \Phi \rangle, \quad (4)$$

which describes the cross entropy between the expected probability given a quantum state $|\Phi\rangle$ and the measured frequency $f_{\tau} = N_{\tau}/N_{\hat{O}}$. In addition, the lower bound for measurement energy on given data is $\min E(\mathcal{D}) = - \sum_{\hat{O}} \sum_{\tau} N_{\hat{O}} f_{\tau} \log f_{\tau}$, which makes $E(\Phi_0|\mathcal{D}) - \min E(\mathcal{D})$ a feasible indicator for satisfiability and convergence.

Measurement-energy minimizations via iterative effective Hamiltonians. For a generic nonlinear cost function $E = f(\langle \hat{O} \rangle)$ defined for the expectation values $\langle \hat{O}_{\kappa} \rangle = \langle \Phi | \hat{O}_{\kappa} | \Phi \rangle$, its functional derivative with respect to $|\Phi\rangle$ should vanish at its minimum,

$$\delta E = \sum_{\kappa} \left. \frac{\partial f(\langle \hat{O} \rangle)}{\partial \langle \hat{O}_{\kappa} \rangle} \right|_{\langle \hat{O} \rangle_{\text{gs}}} \cdot \delta \langle \hat{O}_{\kappa} \rangle_{\text{gs}} = 0, \quad (5)$$

where $\langle \hat{O}_{\kappa} \rangle_{\text{gs}}$ are the expectation values at the minimum. We note that a Hamiltonian \hat{H}_{eff} on the same Hilbert space,

$$\hat{H}_{\text{eff}} = \sum_{\kappa} \alpha_{\kappa} \hat{O}_{\kappa}, \quad (6)$$

should possess a ground state $|\Phi'_{\text{gs}}\rangle$ that satisfies $\delta \langle \hat{H}_{\text{eff}} \rangle = \sum_{\kappa} \alpha_{\kappa} \cdot \delta \langle \hat{O}_{\kappa} \rangle_{\text{gs}} = 0$, which coincides with Eq. (5) if we set $|\Phi'_{\text{gs}}\rangle = |\Phi_{\text{gs}}\rangle$ and

$$\alpha_{\kappa} = \left. \frac{\partial f(\langle \hat{O} \rangle)}{\partial \langle \hat{O}_{\kappa} \rangle} \right|_{\langle \hat{O} \rangle_{\text{gs}}}. \quad (7)$$

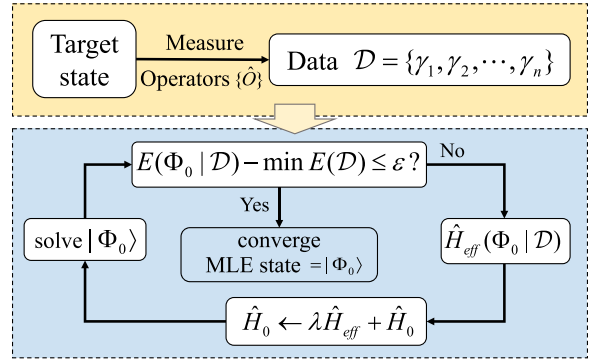


FIG. 1. We outline our strategy for the MLE quantum state: Given the quantum measurement results, we iteratively update \hat{H}_0 with \hat{H}_{eff} and solve its ground state $|\Phi_0\rangle$, which converges to the MLE state $|\Phi_{\text{gs}}\rangle$. The measurement energy $E(\Phi_0|\mathcal{D}) - \min E(\mathcal{D})$ serves as an indicator of convergence and also reveals whether additional measurements and/or observables are preferable.

Equations (6) and (7) form a self-consistent equation for the minimum of measurement energy $E(\Phi|\mathcal{D})$.

Applying such a protocol to the measurement energy in Eq. (4), the effective Hamiltonian is

$$\hat{H}_{\text{eff}} = \sum_{\hat{O}} \sum_{\tau} N_{\hat{O}} \alpha_{\tau} \hat{P}_{\tau}, \quad \alpha_{\tau} = - \frac{f_{\tau}}{\langle \Phi_{\text{gs}} | \hat{P}_{\tau} | \Phi_{\text{gs}} \rangle}, \quad (8)$$

$N_{\hat{O}} = 1$ for single shots. Note that different observables may contribute to the same projection operator. Equation (8) is one of the main conclusions of this Letter: Given the quantum measurements, the self-consistent ground state $|\Phi_{\text{gs}}\rangle$ of Eq. (8) is our MLE quantum state.

However, as the iteration state approaches the target state, every $\langle \hat{P}_{\tau} \rangle \rightarrow f_{\tau}$, resulting in a diminishing \hat{H}_{eff} and unstable eigenstates. Inspired by supervised machine learning [53–56], we introduce an iteration Hamiltonian \hat{H}_0 , which is initiated randomly and updated as $\hat{H}_0 \rightarrow \hat{H}_0 + \lambda \hat{H}_{\text{eff}}$, where λ is the step size. The ground state $|\Phi_0\rangle$ of \hat{H}_0 moves closer and converges to the MLE state upon updates, while \hat{H}_{eff} 's noises average out over the iterations. We summarize the strategy in Fig. 1, and provide further details, rigorous proof, and generalizations to mixed states in Refs. [42,57].

To see how \hat{H}_{eff} performs as an optimizing gradient for \hat{H}_0 , let us consider a toy model with a single qubit $|\Phi_t(\theta, \varphi)\rangle = \cos(\theta/2)|\hat{z}, +\rangle + \sin(\theta/2)e^{i\varphi}|\hat{z}, -\rangle$ as the target state. Among various measurements, let us focus on the $\hat{S}_z = \sigma^z/2$ measurements whose outcomes approach

$$\lim_{N_{\hat{O}} \rightarrow \infty} N_{\pm} = N_{\hat{O}} \langle \Phi_t | \hat{P}_{\pm} | \Phi_t \rangle = N_{\hat{O}} \frac{(1 \pm \cos \theta)}{2}, \quad (9)$$

where $\hat{P}_{\pm} = (1 \pm \sigma^z)/2$ are the projection operators onto the $\sigma^z = \pm 1$ eigenspaces, respectively. Correspondingly, given an iteration state $|\Phi_0(\theta', \varphi')\rangle$, these S_z measurements contribute to the next \hat{H}_{eff} as follows:

$$N_{\hat{O}}(\alpha_+ \hat{P}_+ + \alpha_- \hat{P}_-) = -N_{\hat{O}} \frac{\cos \theta - \cos \theta'}{1 - \cos^2 \theta'} \sigma^z + \text{const}, \quad (10)$$

whose σ^z coefficient is negative (positive) when $\theta' > \theta$ ($\theta' < \theta$), opting for a smaller (larger) θ' at the next iteration, and

so on until convergence at θ . As \hat{S}_z measurements provide no information on φ , φ' remains its initial value. Measurements of $\hat{S}_{n \neq z}$ contribute additional terms to \hat{H}_{eff} and a more comprehensive optimization of \hat{H}_0 and $|\Phi_0(\theta', \varphi')\rangle$.

Unlike previous tomography that faces costly direct parametrization of quantum states and challenging nonconvex optimization, we encode $|\Phi_0\rangle$ intrinsically via \hat{H}_0 , which holds several advantages: Our strategy guarantees efficient descent and convergence [42], and also takes advantage of various established quantum many-body ansatzes, such as Lanczos, density-matrix renormalization group [58,59], and quantum Monte Carlo methods [60,61], neural network states [43], or quantum simulators [62–64]. Essentially, the ansatz choice relies on *a priori* knowledge, such as symmetries and localities, which allows us to conduct more relevant and efficient searches in Hilbert space submanifolds.

It is high time we discussed the choices of observables \hat{O} . If the *a priori* knowledge about the target state is sufficient, we may choose the most physically relevant measurements, usually lower-order and/or local operators; otherwise, such observables still make a good starting point for tentative studies. In reality, we are often limited by experiments and data availability as well. Fortunately, our strategy can still locate the MLE state even under such circumstances and also tell whether the information is inadequate [65], upon which one may decide to resort to additional operators or experiments. We illustrate such a procedure on Haar random quantum states without any *a priori* knowledge in the Supplemental Material [57].

Example: Random long-range fermion model. Let us consider the ground state of the following Hamiltonian,

$$\hat{H} = - \sum_{ij} t_{ij} (c_i^\dagger c_j + c_j^\dagger c_i) - \sum_i \mu_i c_i^\dagger c_i, \quad (11)$$

where $1 \leq i, j \leq L$. We apply random $t_{ij} \in [0, 1]$ between arbitrary sites and $\mu_i \in [-0.5, 0.5]$ to deny the system symmetries and locality. Still, our strategy can derive the target states, placed in a black box and tangible only via quantum measurements, even on relatively large systems. Two-point correlators are key to a fermion direct-product state, whose other properties are obtainable via Wick's theorem, thus we choose the observables $\hat{O}_i = c_i^\dagger c_i$ and $\hat{O}'_{ij} = (c_i^\dagger + c_j^\dagger)(c_i + c_j)/2$, each with two eigenvalues [66], making \hat{P}_τ and \hat{H}_{eff} fermion-bilinear and the subsequent procedure straightforward.

For simplicity, we measure each observable $\hat{O} = \sum_\tau \alpha_\tau \hat{P}_\tau$ on the target quantum state an equal number $N_\delta \rightarrow \infty$ of times to suppress fluctuations. Putting these results on $L = 100$ systems into the iterative process in Eq. (8), we obtain the results in Fig. 2. We observe a quick convergence of the iteration state $|\Phi_0\rangle$ towards the target state, and its average measurement energy $E(|\Phi_0\rangle)$ towards lower bound eigenvalues [67]. Our strategy also works for data laden with quantum fluctuations due to finite numbers of quantum measurements N_δ and the numerical studies reveal that N_δ necessary for a certain fidelity level scales polynomially to the system size [57].

We also extend applications to mixed states: $\rho_0 \propto e^{-H_0}$ as the quantum state and $\text{tr}(\hat{\rho}_0 \hat{P}_\tau)$ as the expectation value

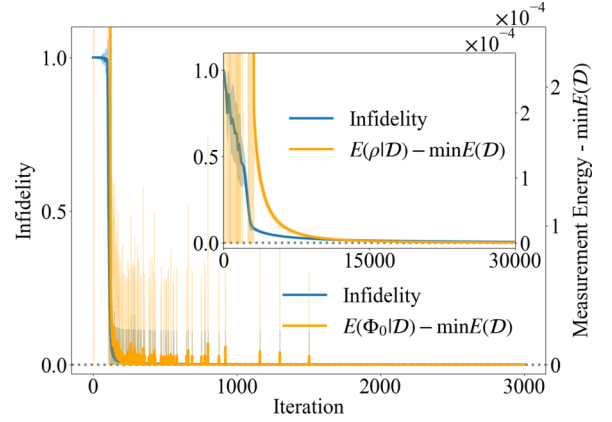


FIG. 2. Following our strategy, the iteration state quickly converges to the target quantum state, and the average measurement energy converges to its lower bound. The infidelity for the pure state and mixed state (shown in the inset) reaches $\sim 6 \times 10^{-4}$ and $\sim 5 \times 10^{-3}$, respectively. The shade is based upon 100 trials on different target states—the ground states and Gibbs states of random long-range fermion models with system size $L = 100$.

in Eq. (8). Based on $N_\delta \rightarrow \infty$ measurements of \hat{O}_i and \hat{O}'_{ij} observables for target Gibbs states $\rho_{\text{tar}} = e^{-\beta \hat{H}} / \text{tr}(e^{-\beta \hat{H}})$ on \hat{H} in Eq. (11) with $L = 100$ sites, we observe a quick and unambiguous convergence of the iteration ρ_0 towards their target (Fig. 2 inset). Further details, examples, and proof for mixed states are in Refs. [42,57].

Example: Strongly correlated Kitaev QSL state. Let us consider the nearest-neighbor spin Hamiltonian on the honeycomb lattice,

$$\hat{H} = \sum_{(ij) \in \alpha\beta(\gamma)} [J_{ij} \vec{S}_i \cdot \vec{S}_j + K_{ij} S_i^\gamma S_j^\gamma + \Gamma_{ij} (S_i^\alpha S_j^\beta + S_i^\beta S_j^\alpha)], \quad (12)$$

which potentially describes the Kitaev physics in the $A_2\text{IrO}_3$ -family iridates [68] and Kitaev material RuCl_3 [20]. K_{ij} , J_{ij} , and Γ_{ij} are the amplitudes of the Kitaev interaction, isotropic Heisenberg interaction, and the symmetric off-diagonal interactions on bond $\langle ij \rangle$, respectively. Depending on the bond dimension, each bond is labeled by $\alpha\beta(\gamma)$, where $\gamma = x, y, z$ is the spin direction in the Kitaev term, and α, β are the two orthogonal spin directions in the Γ_{ij} term. The pristine Kitaev model ($J_{ij} = \Gamma_{ij} = 0$) is analytically solvable [18,57]. We take the ground state of \hat{H} with a dominant Kitaev term on a 3×3 system with a periodic boundary condition, illustrated in the inset of Fig. 3(b), as our target quantum state. The resulting QSL states are notorious for their lack of smoking-gun signatures. Instead, we probe the target quantum states with seemingly trivial quantum measurements. As we will see, these measurements still provide insightful information, and our strategy leads to the target states and, in turn, their abstract natures, including the QSL phase [7–9] and quantum entanglements [2–6].

To begin with, we set $K_{ij} = -1$, $J_{ij} = 0.1$. Given the C_3 rotation symmetry, there are three degenerate ground states, shown in the inset of Fig. 3(a). These ground states are topologically degenerate with no quasiparticles [18,29,57,69]. The ground states of local Hamiltonians follow the area law,

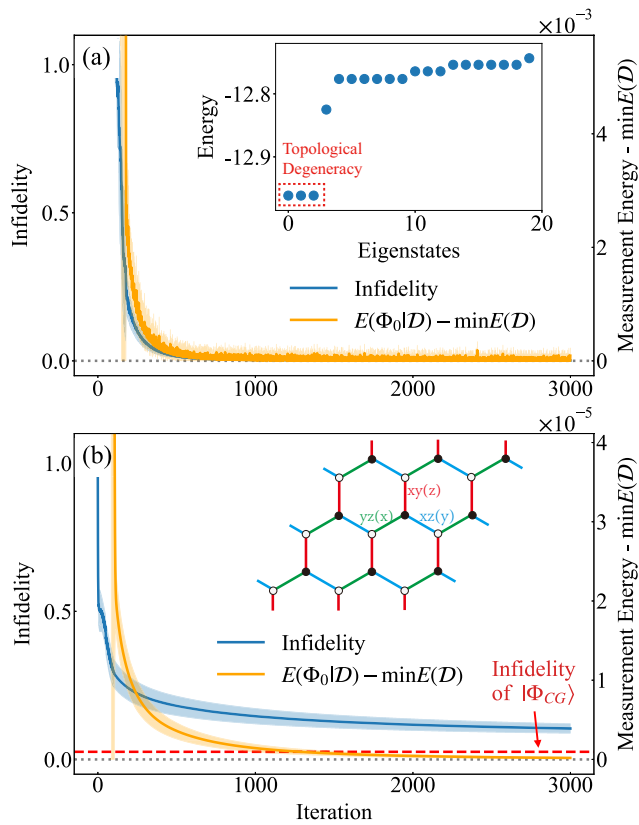


FIG. 3. (a) We apply our strategy to the quantum-measurement outcomes of $\sigma_i^\lambda \sigma_j^\lambda$, $\lambda = x, y, z$, on one of the ground states of Eq. (12) with $K_{ij} = -1$, $J_{ij} = 0.1$, and $\Gamma_{ij} = 0$ (spectrum in the inset), where the measurement energy $E(\Phi_0|D)$ quickly saturates the lower bound, while the iteration states $|\Phi_0\rangle$ converge to the target state with infidelity $\sim 10^{-3}$. (b) With the same measurements on the ground states for $K_{ij} = 1$, $J_{ij} = 0.1$, and $\Gamma_{ij} \in [0, 0.1]$, the measurement energy $E(\Phi_0|D)$ still quickly saturates the lower bound, while the MLE states $|\Phi_{\text{gs;trial}}\rangle$ show a slight infidelity ~ 0.1 with the target state and differ between trials with an average overlap ~ 0.83 . The red dashed line shows the state Φ_{CG} averaged over multiple trials [57], which offers an improved approximation with infidelity ~ 0.03 . The shades are based on multiple trials with different initializations. The inset in (b) is a sketch of the Kitaev model on a 3×3 honeycomb lattice.

allowing us to limit to k -local, starting from 2-local operators. Here, we first consider quantum measurements on simple observables $\sigma_i^\lambda \sigma_j^\lambda$ of each $\langle ij \rangle$ bond on one of the ground states, $\lambda = x, y, z$. Similar quantum measurements are potentially available to QSL models in Rydberg-atom systems [70–72], or via electron-spin-resonance scanning tunneling microscopy experiments [73,74], etc. In the large $N_\partial \rightarrow \infty$ limit, we obtain $N_\pm(ij, \lambda) = N_\partial \times \langle \hat{P}_\pm(ij, \lambda) \rangle$ counts of ± 1 outcomes, $\hat{P}_\pm(ij, \lambda) = (1 \pm \sigma_i^\lambda \sigma_j^\lambda)/2$, respectively. Putting these results into the iterations in Eq. (8), $|\Phi_0\rangle$ successfully converges to the target ground-state manifold [see Fig. 3(a)]. Interestingly, starting from a single ground state, we possess the entire topologically degenerate manifold with high fidelity [57], with which we can achieve fundamental properties such as quasiparticle statistics [7–9]. On the one hand, these states share identical local properties, thus equal qualifications for

the MLE states; on the other hand, their simultaneous presence implies that \hat{H}_0 inherits topological information already present in the target state.

Another interesting scenario is when the observables involved are insufficient to locate the target state fully, as multiple states saturate the measurement energy to the lower bound. For example, we consider the ground state of $K_{ij} = 1$, $J_{ij} = 0.1$, and random $\Gamma_{ij} \in [0, 0.1]$ on each bond. The system possesses a unique ground state without topological degeneracy on a 3×3 system [57]. We keep our observables $\sigma_i^\lambda \sigma_j^\lambda$, $\lambda = x, y, z$ and a large number $N_\partial \rightarrow \infty$ of quantum measurements as before, whose results on ten independent trials are summarized in Fig. 3(b). While all trials converge fully and leave little measurement-energy residue, the obtained MLE states $|\Phi_{\text{gs;trial}}\rangle$ differ from trial to trial, with an average overlap ~ 0.83 in between. We cannot further distinguish these states, which satisfy the quantum measurements equally, until additional observables for further information. Also, we may seek common ground $|\Phi_{\text{CG}}\rangle$ between $|\Phi_{\text{gs;trial}}\rangle$ as a contingency plan in the case of limited ambiguity; see the red dashed line in Fig. 3(b) and details in the Supplemental Material [57].

Finally, we consider the following scenario to showcase the adaptability of our strategy: The observables on nearest-neighbor bonds are $\sigma_i^{\hat{n}} \sigma_j^{\hat{n}}$ for random \hat{n} directions and measured once each. Such single-shot results, a list of ± 1 outcomes, are plagued with ultimate fluctuations and hard to make use of; nevertheless, our strategy can capitalize on their intrinsic information and unravel the underlying target state. To further increase the challenge, we pick disordered non-Abelian topologically ordered states by setting $K_{ij} = -1$ and random $J_{ij} \in [0, 0.1]$, $\Gamma_{ij} \in [0, 0.3]$ on each bond for our target quantum many-body states, whose topological proper-

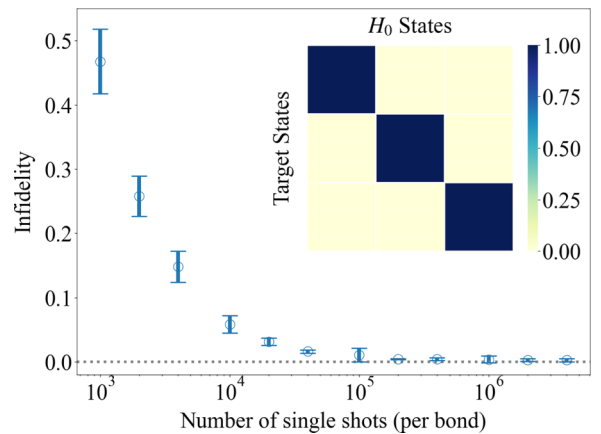


FIG. 4. Single-shot quantum measurements $\sigma_i^{\hat{n}} \sigma_j^{\hat{n}}$ for random \hat{n} directions yield a list of fluctuation-laden ± 1 . Based upon such single-shot outcomes from non-Abelian topologically ordered ground states with $K_{ij} = -1$, $J_{ij} \in [0, 0.1]$, $\Gamma_{ij} \in [0, 0.03]$ in the Kitaev model in Eq. (12), our strategy allows the MLE states to converge asymptotically well to the target states within 1500 iterations as the number of single shots increases. The error bars are based on ten different trials. The inset demonstrates the fidelity between the lowest three eigenstates of the iteration \hat{H}_0 at convergence and the topological degenerate states of the target system.

ties are analyzed in detail in the Supplemental Material [57]. We summarize the demonstration in Fig. 4: The more single shots, the more information is at disposal, and the higher the fidelity of the MLE states $|\Phi_{\text{gs}}\rangle$; based on a single state, we also obtain the degenerate manifold, even low-lying excited states [57], with high fidelity eigenvalues [75]. We emphasize that although our setup resembles the shadow tomography [41], it neither satisfies nor requires the shadow's randomness prerequisite. Indeed, our strategy is generally applicable and does not rely on any scheme of measurements.

Discussions. Considering the exponentially large Hilbert space of a quantum many-body system, we have offered a quantum strategy to interpret quantum measurements in a general and precise way. With full information and reliable convergence, our approach yields state-of-art performance, as demonstrated by several previously intractable examples above and even for a generic quantum many-body state (in the Supplemental material [57]). We note that the additive form of the measurement energy in Eq. (3) means that every

single-shot quantum measurement counts. On the other hand, for cases where the measurement outcomes \mathcal{D} are not directly obtainable, we can reverse engineer values of f_τ from the expectation values $\langle\hat{O}\rangle$, $\langle\hat{O}^2\rangle$, ... [36], and $N_{\hat{O}}$ as a confidence measure. Our strategy also paves the way for Hamiltonian reconstruction [42,76,77]. Generalizations on quantum measurements connecting ground state and excited states, e.g., inelastic spectroscopy experiments, remain an open question for future research.

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