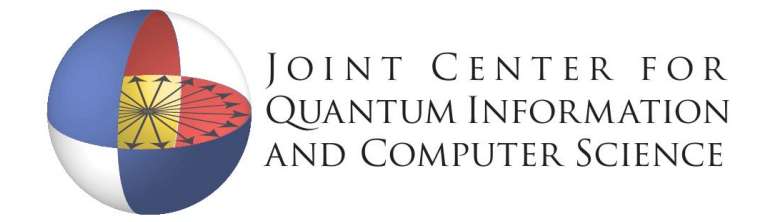


# Quantum Approximate Optimization of the Long-Range Ising Model with a Trapped-Ion Quantum Simulator



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## Abstract

Quantum state preparation on near-term quantum hardware can benefit from a hybrid approach, where a classical computer optimizes a parameterized quantum circuit using energy samples from a quantum device that implements the circuit. The Quantum Approximate Optimization Algorithm (QAOA) framework may be well-suited to testing such a quantum-classical interplay, and has been successful in producing fast, approximate optimization protocols. Here, we apply QAOA to the state preparation problem for a transverse field Ising model (TFIM) with long-ranged, power law interactions. We show that a variationally optimized, low-depth QAOA circuit can scalably approximate the ground state at criticality, and present a novel approach to discovering optimal QAOA paths based on numerical evidence for an asymptotically optimal path. We demonstrate our approximate state preparation protocol on a trapped ion hardware of up to 40 spins. (arXiv: 1906.02700)

## TFIM with power-law coupling

The following model can be simulated on trapped-ion quantum hardware, for up to 40 ions:

$$H(J, B, \alpha) = J \sum_{i < j} \frac{1}{|j - i|^\alpha} Z_i Z_j + B \sum_i X_i$$

Goal: Prepare the ground state of H.

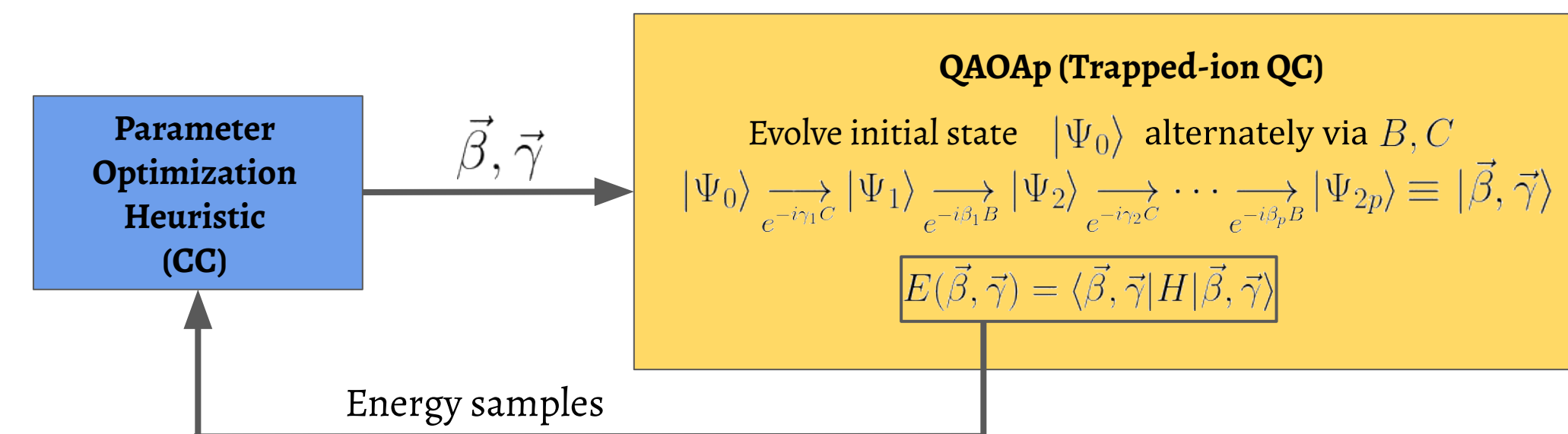
State preparation protocols may use the above Hamiltonians or either components B,C, with evolution times limited by the experiment.

Options:

1. Adiabatic Evolution: Expected to scale poorly at model criticality, due to closing gap.
2. Classical Simulation methods: No guarantees on easy/hardness, but likely hard in general. DMRG works only for a 1D system.
3. (This work) Variational techniques: parameterized circuit guided by a classical search - here, we try QAOA. *A priori, we do not expect this approach to fail in higher dimensional models at criticality.*

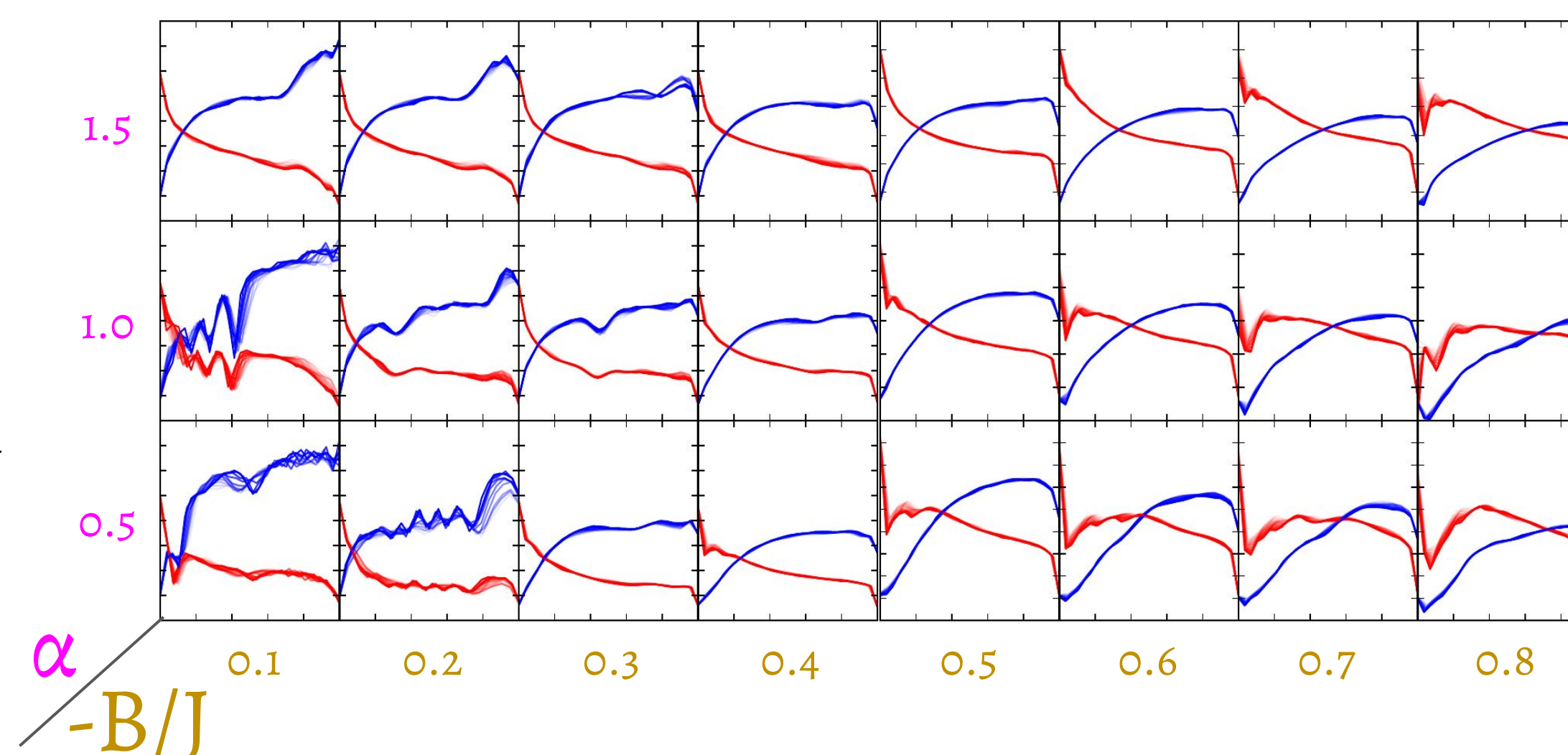
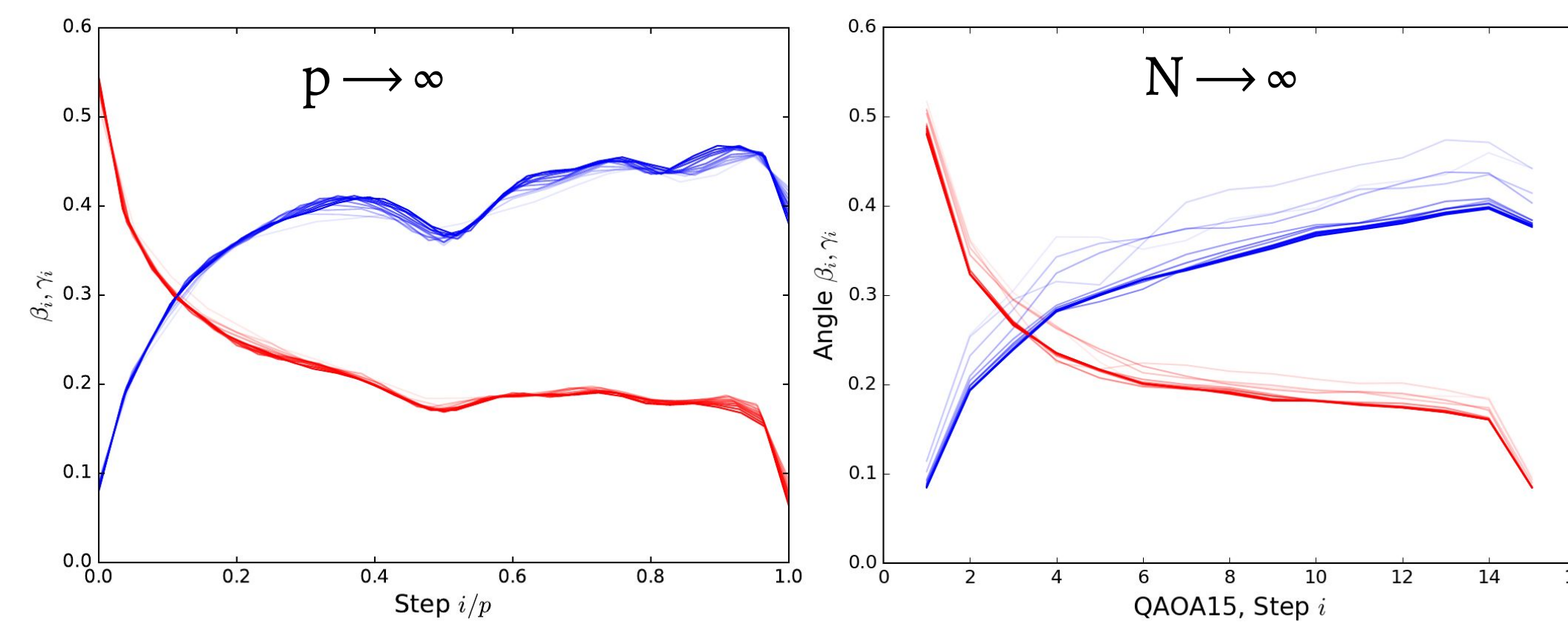
## Quantum Approximate Optimization Algorithm

While originally an algorithm for finding approximate solutions to hard combinatorial optimization problems, the QAOA framework is applicable to the problem of state preparation as well.



## Optimal angle parameters

Empirically, the optimal QAOA angles lie along a smooth curve parameterized by the (normalized) step number,  $s := (i-1)/(p-1)$ . The angle sets  $(\beta_1, \beta_2, \dots, \beta_p)$  and  $(\gamma_1, \gamma_2, \dots, \gamma_p)$  each approximate a curve that converges in the infinite  $p$  limit. We see a similar convergence in number of spins  $N$ .



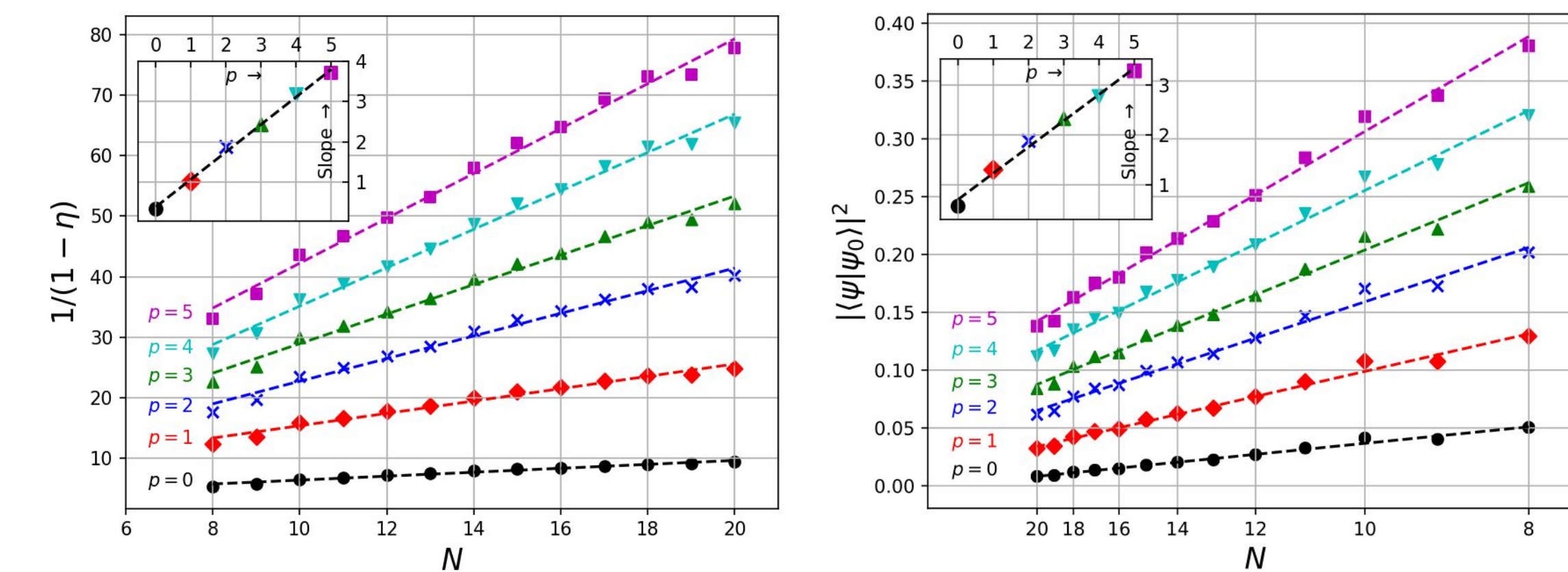
## Variational Optimization Heuristic

The structure in the QAOA optimal angle sequences can be used to build a scalable heuristic for state preparation:

1. Find angle sequences for low  $p, N$  classically.
2. Use dynamic programming in  $p, N$  as follows:
  - a.  $N \rightarrow N+1$ : For each  $i=1, \dots, p$ , extrapolate the sequence  $\{\beta_i^{(m)}: m=1, \dots, N\}$  (resp.  $\{\gamma_i^{(m)}\}$ ) to generate an initial guess for  $\beta_i^{(N+1)}$  (resp.  $\gamma_i^{(N+1)}$ ). Perform local optimization.
  - b.  $p \rightarrow p+1$ : Interpolate the optimized angle curve for  $p$ , then resample using spacing  $1/p$  to generate  $p+1$  points as an initial guess for local optimization.
3. Terminate at desired  $p, N$ .

Our algorithm is expected to scale as a small polynomial in  $p, N$  when used with the quantum simulator in a hybrid manner.

## Performance Scaling at criticality



Left:  $\eta$  is energy normalized by spectral bandwidth, so that  $\eta=0$  is the highest energy state while  $\eta=1$  is the ground state. Numerics suggest that  $\eta \sim 1-1/(pN)$  for large  $p, N$ .

Right: Squared overlap with the ground state plotted by  $p, N$ . The plot suggests that square overlap  $\sim p/N$ .

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