



# Neural Quantum States for the Interacting Hofstadter Model with Higher Occupations and Long-Range Interactions

Fabian Döschl<sup>1,2</sup>, Felix Palm<sup>1,2,3</sup>, Hannah Lange<sup>1,2,4</sup>, Fabian Grusdt<sup>1,2</sup>, Annabelle Bohrdt<sup>2,5</sup>

(1) Department of Physics and Arnold Sommerfeld Center for Theoretical Physics, LMU Munich, Theresienstr. 37, Munich, D-80333, Germany (2) Munich Center for Quantum Science and Technology, Schellingstr. 4, D-80799 Munich, Germany (3) CENOLI, Université Libre de Bruxelles, CP 231, Campus Plaine, B-1050 Brussels, Belgium (4) Max-Planck-Institute for Quantum Optics, Hans-Kopfermann-Straße 1, D-85748 Garching, Germany (5) Institute of Theoretical Physics, University of Regensburg, Universitätsstr. 31 Regensburg D-93053, Germany

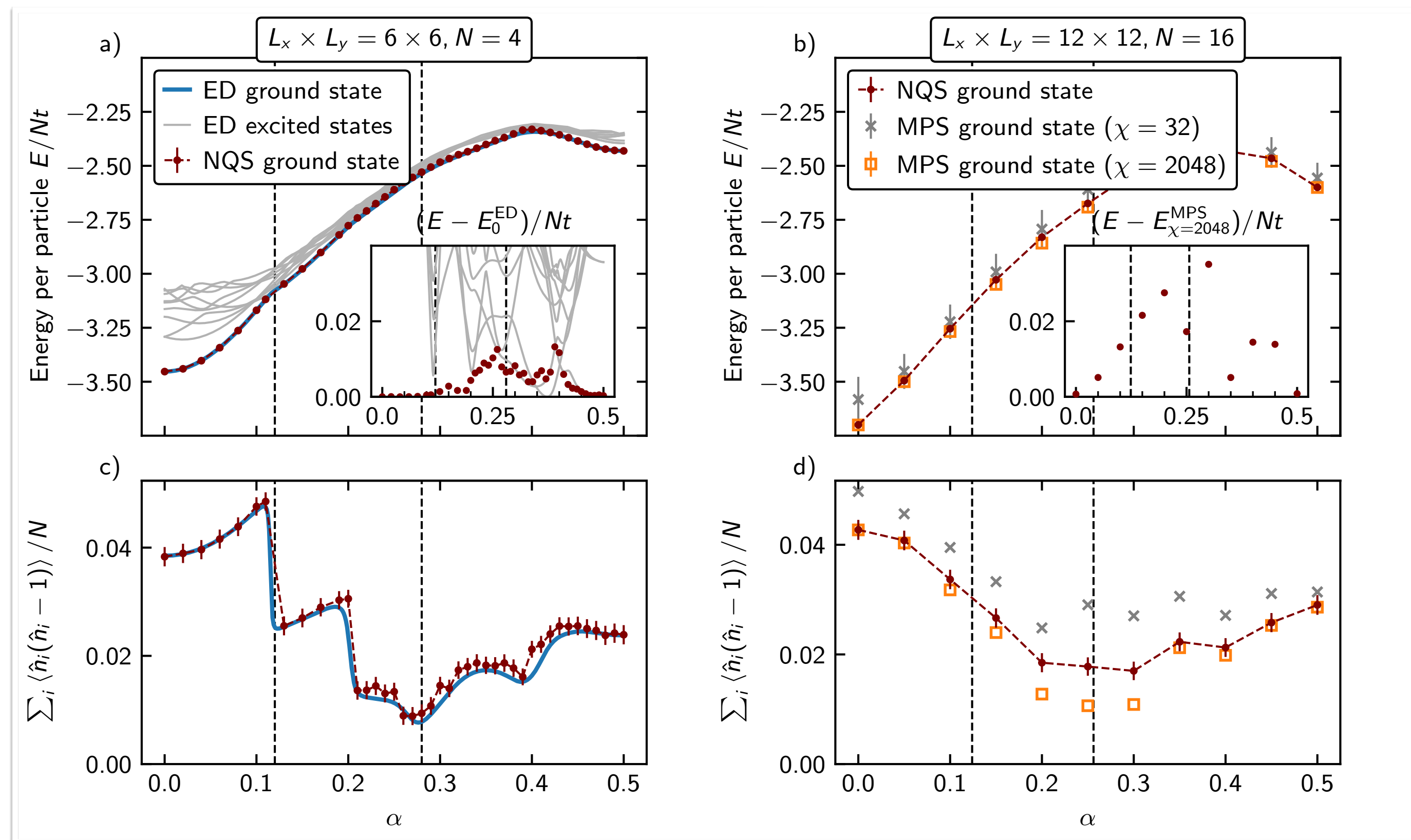
## Introduction

Neural quantum states (NQS) have gained significant interest due to their representational power and potential to rival state-of-the-art numerical techniques, especially for large, two-dimensional quantum systems [1]. This study uses recurrent neural network (RNN) wave functions to model quantum many-body systems [2]. Specifically, we employ a 2D tensorized gated RNN to explore the bosonic Hofstadter model with a variable Hilbert space cut-off and long-range interactions. Benchmarking the RNN-NQS for the Hofstadter-Bose-Hubbard (HBH) Hamiltonian, we find that it efficiently captures most ground state properties. We further analyze a more challenging Hofstadter model with long-range interactions, which describes Rydberg-dressed atoms subject to a synthetic magnetic field. Studying systems up to  $12 \times 12$  sites, we identify a bubble and Wigner crystal phase in addition to the HBH-regime. Here, the bubble crystal phase offers a starting point for the search of clustered liquid phases with potentially non-Abelian anyon excitations. This work demonstrates that NQS is an efficient, reliable tool for simulating complex quantum systems with the ability to simulate long-range interactions.

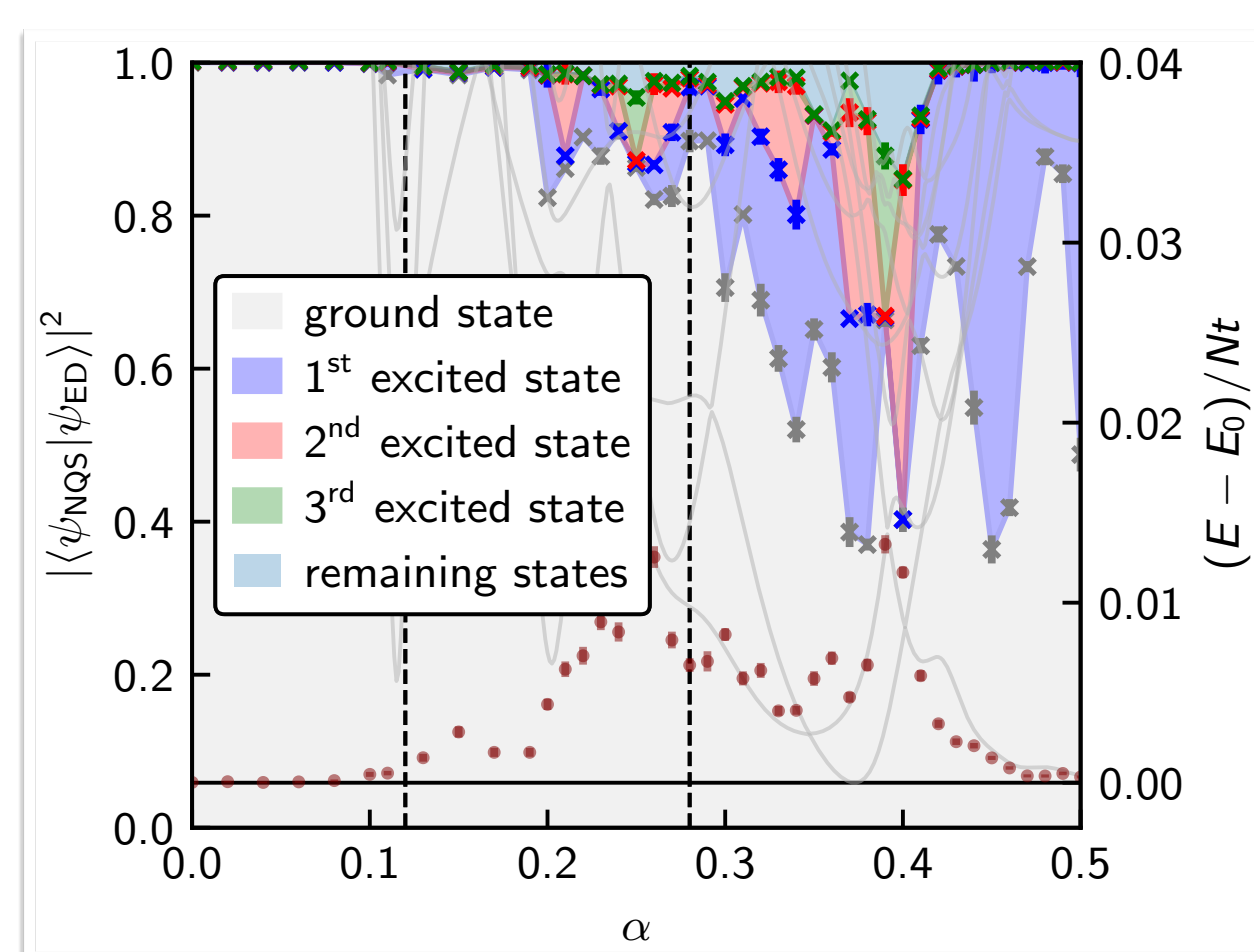
## Hofstadter-Bose-Hubbard Model

To benchmark the NQS we apply the algorithm to the paradigmatic Hofstadter model with on-site interactions [4]:

$$\hat{H} = -t \sum_{x,y} (\hat{a}_{x+1,y}^\dagger \hat{a}_{x,y} + h.c.) - t \sum_{x,y} (\hat{a}_{x,y+1}^\dagger \hat{a}_{x,y} e^{i2\pi\alpha x} + h.c.) + \frac{U}{2} \sum_{x,y} \hat{n}_{x,y} (\hat{n}_{x,y} - 1).$$



The RNN-NQS obtains reliable estimations for observables in the smaller system. For the larger system, its results closely match the benchmark method, except for  $\alpha$  values close to the topologically ordered Laughlin state ( $\nu_{\frac{1}{2}} = \frac{N}{2N-1} = \frac{N}{\alpha N_{\text{plaquette}}}$ ). Note that MPS ( $\chi = 32$ ) has a comparable number of variational parameters to the NQS, while performing worse.



The overlap with exact states offers insights into the trained RNN-NQS. At lower  $\alpha$  values, the NQS achieves a perfect ground state overlap, but as  $\alpha$  increases, contributions from other low-energy states grow.

## Conclusion

**RNN-NQS in FQH Systems:** We successfully simulated fractional quantum Hall systems with RNN-NQS, which accurately captured most ground state properties on both  $6 \times 6$  and  $12 \times 12$  lattices.

**Phase Diagram Findings:** In addition to the Hofstadter-Bose-Hubbard regime, we identified a Wigner crystal and bubble crystal phase in the Hofstadter model with long-range interactions.

**NQS Benefits:** Efficient for systems with long-range interactions and high local occupations, complementing traditional methods specialized for short-range interactions.

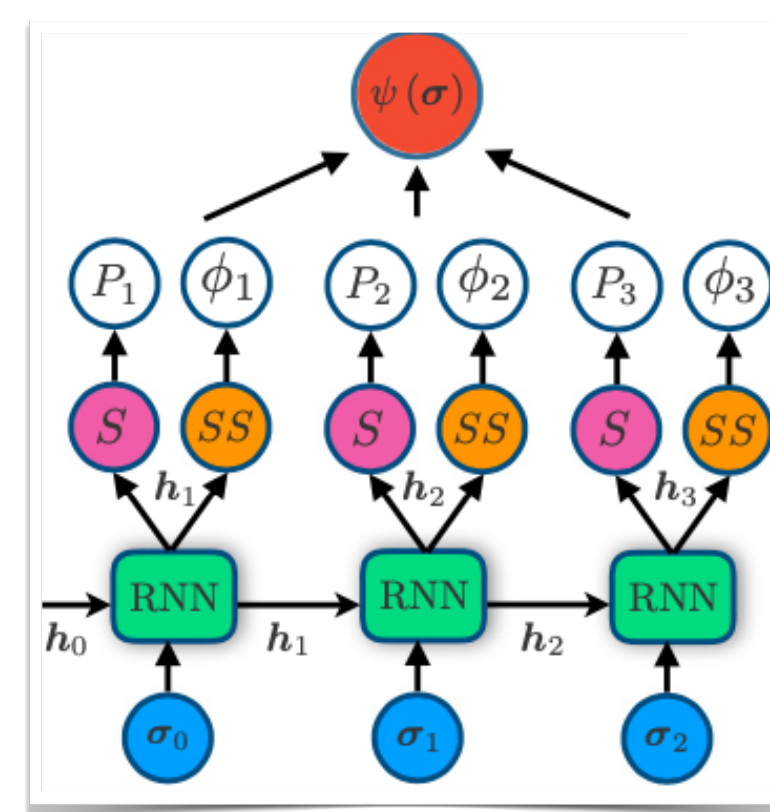
## NQS-Model

We use a 2D tensorized gated RNN structure that allows to sample directly from the wave function [2][3]. The wave function is defined as follows:

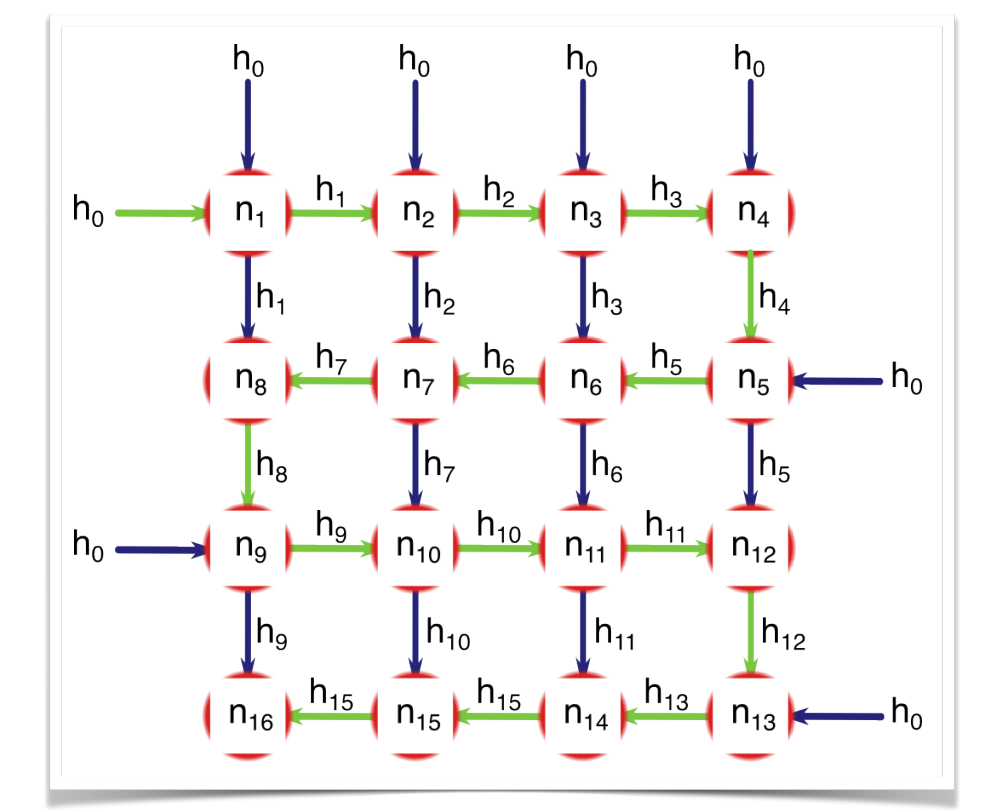
$$|\Psi\rangle = \sum_n \psi_\lambda(n) |n\rangle = \sum_n e^{i\phi_\lambda(n)} \sqrt{P_\lambda(n)} |n\rangle,$$

with  $P_\lambda(n) = \prod_i p_\lambda(n_i | n_{j < i})$  and  $\Phi_\lambda(n) = \sum_i \phi_\lambda(n_i | n_{j < i})$ .

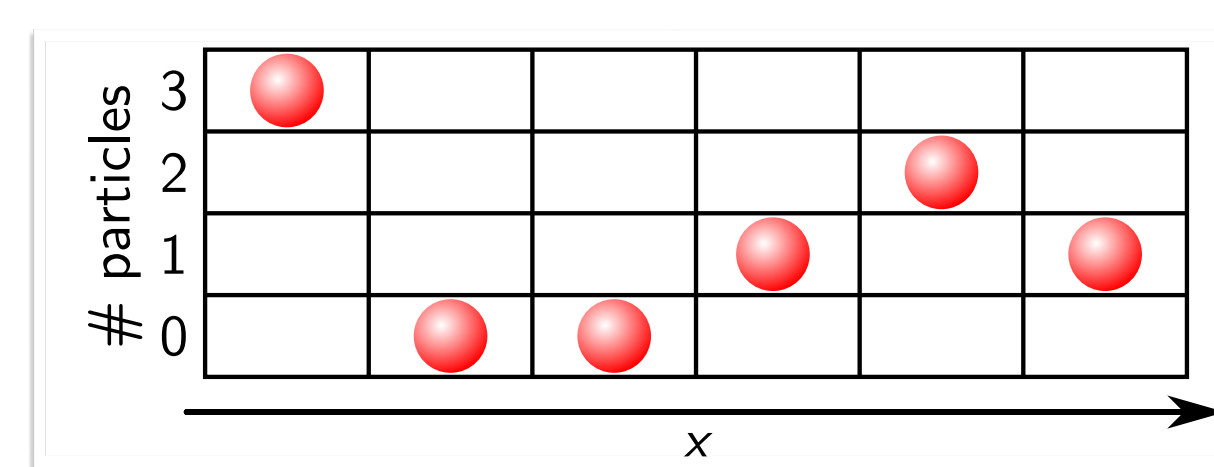
To obtain the conditional probability  $p_\lambda(n_i | n_{j < i})$  and the phase  $\phi_\lambda(n_i | n_{j < i})$ , the local hidden state of the RNN is interpreted by linear layers with softsign and softmax activation functions.



Scheme for the evaluation of the wave function with RNNs [2].



The 2D RNN structure is designed to prevent a numerical separation of neighboring sites.

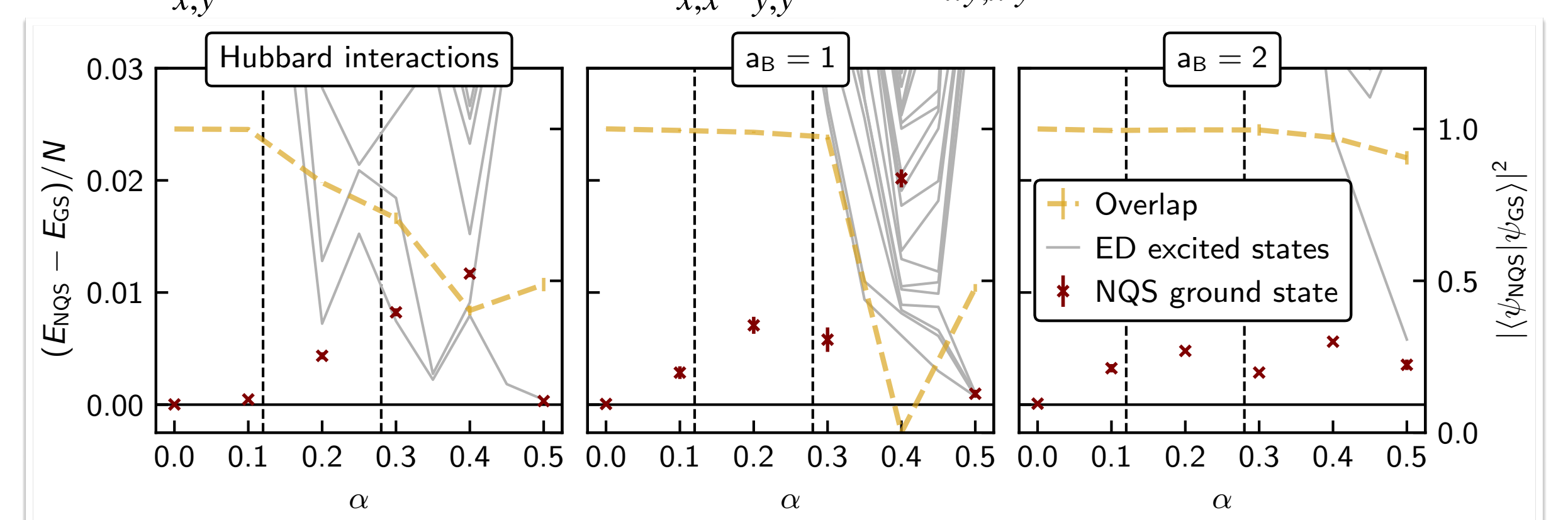


So far, only systems with a naturally restricted local Hilbert space where studied with autoregressive NQS. To apply this algorithm to bosonic systems, a cut-off has to be introduced.

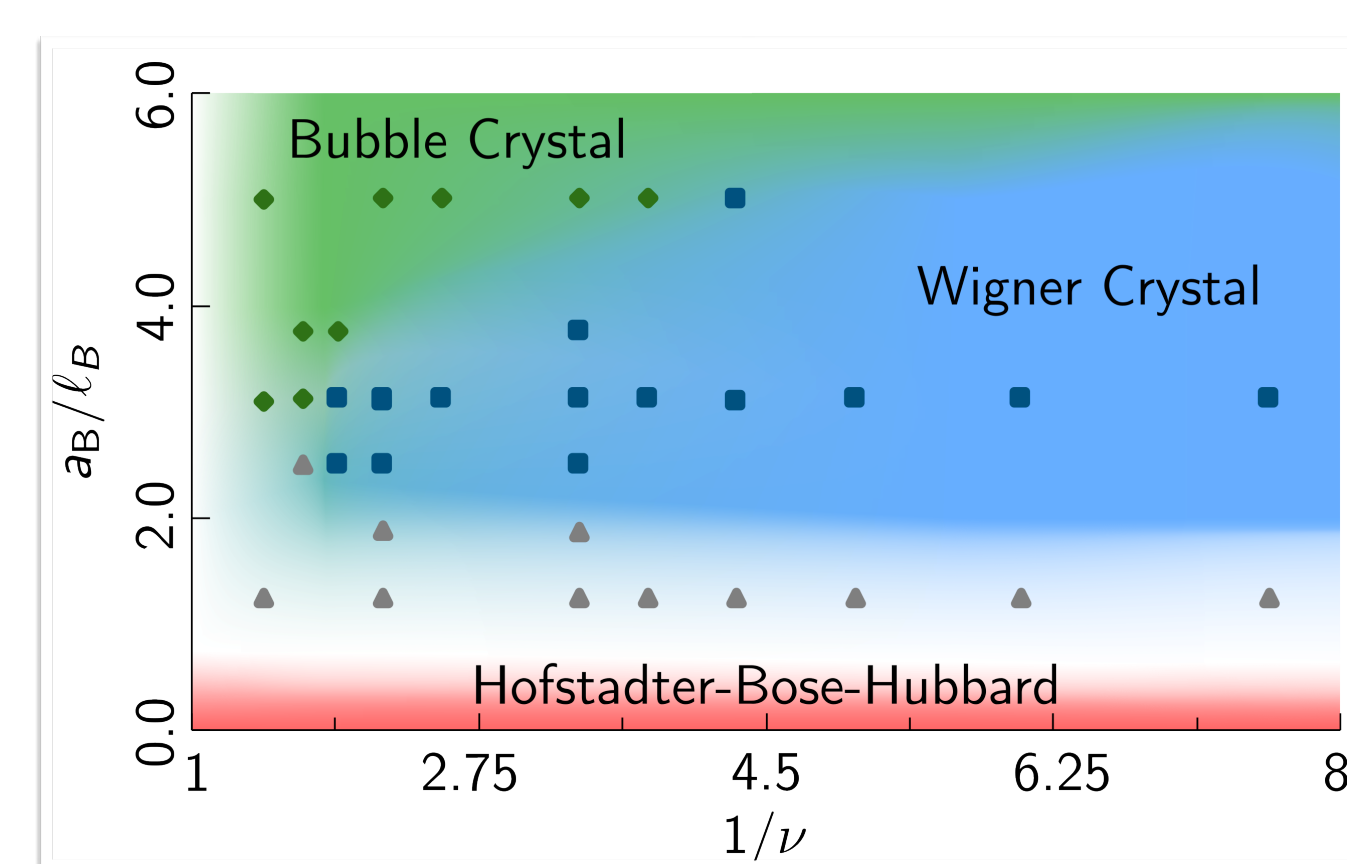
## Hofstadter Model with Long-Range Interactions

While most interactions in nature are long-ranged, accurately representing them in numerical simulations can be quite challenging. In this work, we demonstrate that NQS can efficiently model long-range interactions by presenting results for a system of Rydberg-dressed atoms in a magnetic field, which potentially hosts non-Abelian fractional quantum Hall states [5].

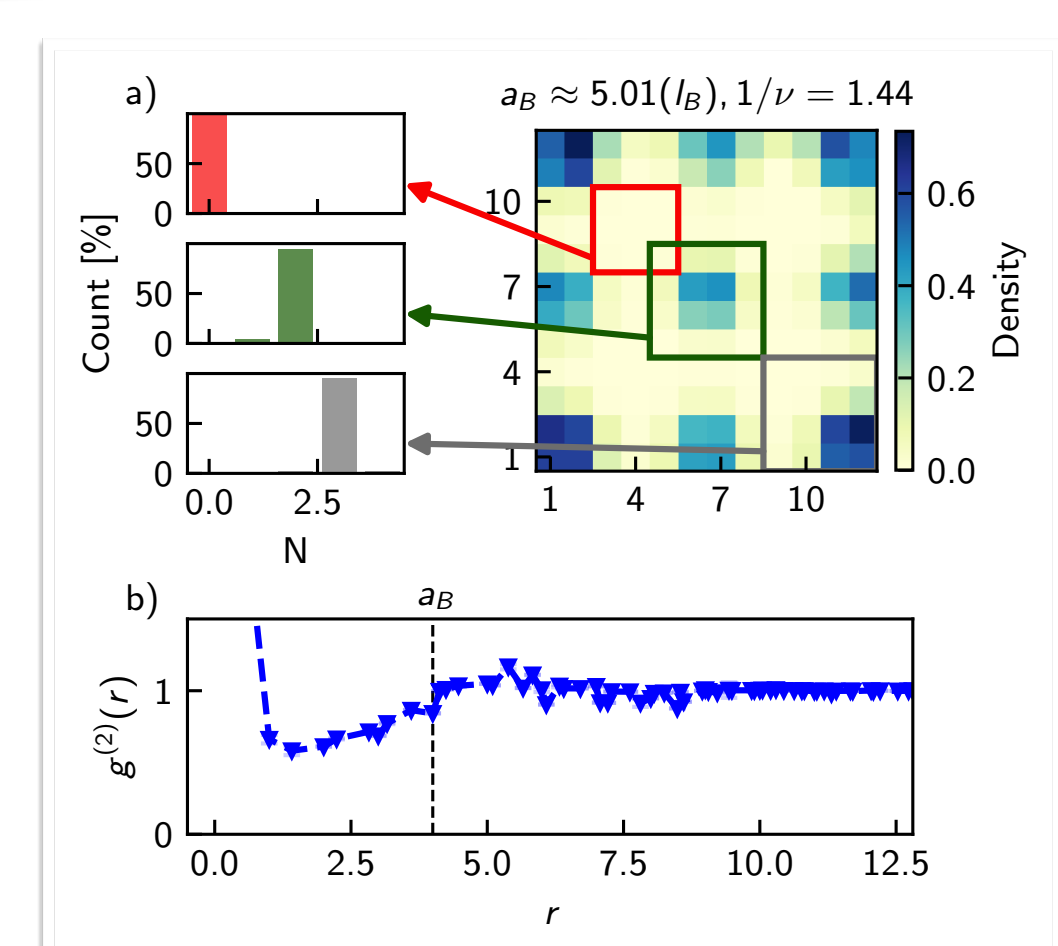
$$\frac{U}{2} \sum_{x,y} \hat{n}_{x,y} (\hat{n}_{x,y} - 1) \rightarrow \frac{U_0}{2} \sum_{x,x'} \sum_{y,y'} \frac{a_B^6}{a_B^6 + r_{xy,x'y'}^6} \hat{n}_{x,y} (\hat{n}_{x',y'} - \delta_{x,x'} \delta_{y,y'}).$$



While the overall energy error for the considered  $6 \times 6$  system is only marginally affected by the change of interactions, the ground state overlap improved significantly in most cases.



Furthermore, we investigated the phases of a  $12 \times 12$  lattice system that can be feasible for cold atom experiments, while providing access to novel phases.



Examples for a bubble crystal (left) and a Wigner crystal (right).

## References

- [1] Carleo and Troyer, *Science* 355, 602 (2017)
- [2] Hibat-Allah et al., *Phys. Rev. Research* 2, 023358 (2020)
- [3] Hibat-Allah et al., *PhysRevB*. 108, 075152 (2023)
- [4] Palm et al., *Phys. Rev. B* 103, 161101 (2021)
- [5] Grusdt et al., *Phys. Rev. A* 87, 043628 (2013)