

Title: A QMC study of the Rydberg phase diagram

Speakers: Anna KnÃ¶rr

Collection: Machine Learning for Quantum Many-Body Systems

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# A QMC study of the Rydberg phase diagram

Anna Knörr

Supervised by Roger Melko

Based on my master's defence (last week!)  
& an internship with QuEra Computing Inc.

June 2023





## How this talk relates to this conference.

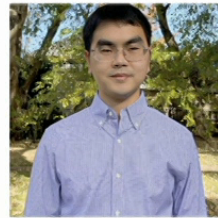
- ▶ Machine learning? Nope.
- ▶ Quantum many body physics? Definitely.
- ▶ Techniques used?
  - ▶ Stochastic Series Expansion Quantum Monte Carlo (SSE QMC)
    - ▶ based on SSE-QMC code by Ejaaz Merali & Isaac de Vlugt
    - ▶ internship & continuing collaboration with QuEra (Milan Kornjaca & Fangli Liu)



Ejaaz Merali



Milan Kornjaca



Fangli Liu



Jonathan Wurtz

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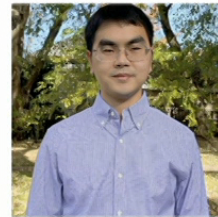
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    - ▶ internship & continuing collaboration with QuEra (Milan Kornjaca & Fangli Liu)
  - ▶ Experimental data from QuEra's 256 qubit processor *Aquila*
    - ▶ provided by Fangli Liu & Jonathan Wurtz (QuEra Computing Inc.)



Ejaaz Merali



Milan Kornjaca



Fangli Liu



Jonathan Wurtz

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The second quantum revolution is being powered both by theoretical understanding as well as **exquisite quantum control**, down to the level of single atoms.

Big shout out to experimentalists!

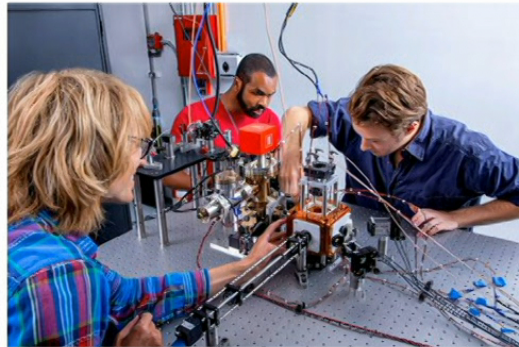


Figure: Niki, Julian and Connor building a quantum processor. Photo credits: QuEra Computing Inc.

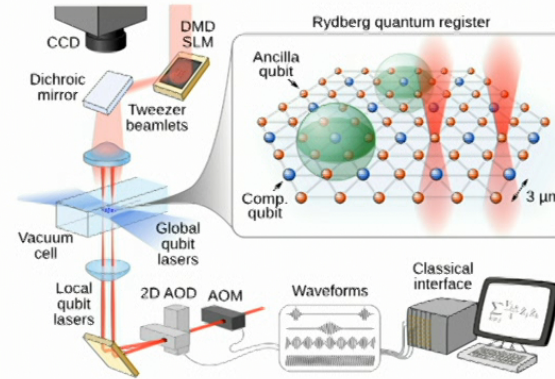
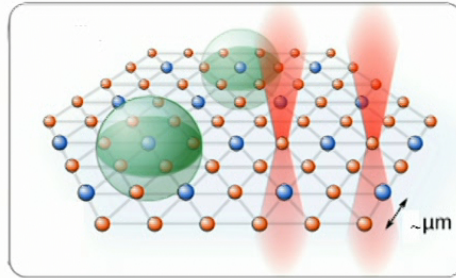


Figure: Reproduced from Browaeys et al. (2020) [1].

# Synthetic quantum matter: Atom arrays

*"One approach to [quantum computing] was suggested by Richard Feynman and consists in building a **synthetic quantum system in the lab**, implementing a model of interest for which no other way to solve it is known. The model may be an approximate description of a real material, but it can also be a purely abstract one. In this case, its implementation leads to the construction of an **artificial many-body system, which becomes an object of study in its own.**" Browaeys et al. (2020)*



Source (quote + figure): Browaeys et al. (2020) [1].



# Describing atom arrays

Our protagonist: The Rydberg Hamiltonian

$$\frac{H_{Ryd}(t)}{\hbar} = \frac{\Omega(t)}{2} \sum_i (|g_i\rangle \langle r_i| + |r_i\rangle \langle g_i|) - \Delta(t) \sum_i n_i + \sum_{i<j} V_{ij} n_i n_j,$$

where  $|g_i\rangle$  and  $|r_i\rangle$  describe the ground and an excited Rydberg state of the  $i$ -th atom and  $n_i$  is its occupation operator measuring whether an excitation is present.

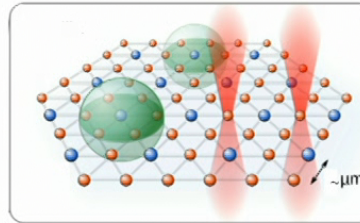


Figure: Reproduced from Browaeys et al. (2020) [1].

# Global detuning

## The Rydberg Hamiltonian

$$\frac{H_{Ryd}(t)}{\hbar} = \frac{\Omega(t)}{2} \sum_i (|g_i\rangle \langle r_i| + |r_i\rangle \langle g_i|) - \Delta(t) \sum_i n_i + \sum_{i<j} V_{ij} n_i n_j$$

Detuning of the Rabi drive by  $\Delta$ .

Useful analogy in many-body picture:  
similar effect to a **chemical potential**.

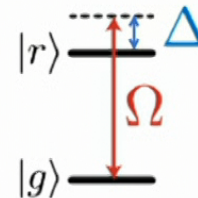


Figure: Reproduced from Ebadi et al. (2020) [2].

# The building block: Rydberg states

Atomic states with electrons excited close to ionization limit (i.e. high principal quantum number  $n \gtrsim 10$ ) exhibiting **exaggerated properties**.

Property	$n$ dependence
Binding energy	$n^{-2}$
Energy between adjacent $n$ states	$n^{-3}$
Orbital radius	$n^2$
Geometric cross section	$n^4$
Dipole moment ( $nd er nf$ )	$n^2$
Polarizability	$n^7$
Radiative lifetime	$n^3$
Fine-structure interval	$n^{-3}$

Figure: Scaling relations of Rydberg atoms, reproduced from Gallagher (1994) [3]. The scaling of the dipole moment  $\propto n^2$  is crucial to using Rydberg atoms as qubits.

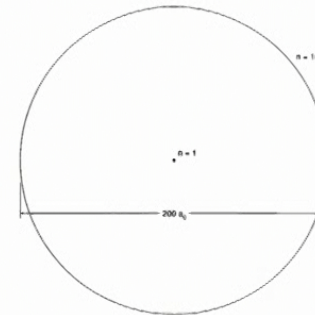


Figure: Visualization of orbital radius scaling  $\propto n^2$ . Reproduced from Gallagher (1994) [3].

# Atom-atom interactions

Leading electrostatic interaction (at interatomic distances  $r_{jk} > a_0$ ): **dipole-dipole interaction**,

$$V_{dd}(R) \propto \frac{\mu_j \mu_k}{R^3},$$

where  $\mu_j$  and  $\mu_k$  denote the transition dipole moment operators for the j-th and k-th atom.

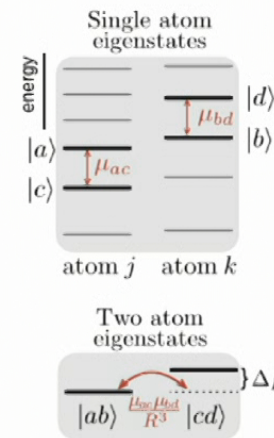


Figure: Reproduced from Morgado et al. (2021) [4].

# Atom-atom interactions: van der Waals

Leading electrostatic interaction (at interatomic distances  $r_{jk} > a_0$ ): **dipole-dipole interaction**,

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where  $\mu_j$  and  $\mu_k$  denote the transition dipole moment operators for the  $j$ -th and  $k$ -th atom.

In a certain limit ( $\Delta_F > |\mu_{ac} \mu_{bd}|$ ), second-order perturbation theory in the low energy subspace yields the following diagonal term,

$$\hat{H}_{int} = -\frac{C_6}{R^6} |ab\rangle \langle ab|,$$

where the **van der Waals** coefficient is given by

$$C_6 = \frac{|\mu_{ac}|^2 |\mu_{bd}|^2}{\Delta_F}.$$

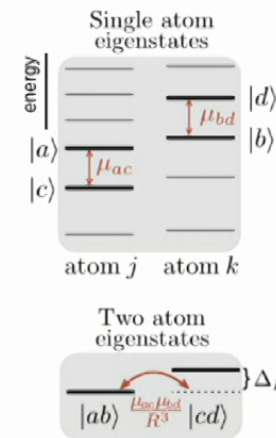


Figure: Reproduced from Morgado et al. (2021) [4].

## Blockade effect

Blockade condition:

$$R \ll R_b \iff \hbar\Omega \ll C_6/R^6,$$

i.e. the **blockade radius** is defined as  $R_b = (C_6/\hbar\Omega)^{1/6}$ .

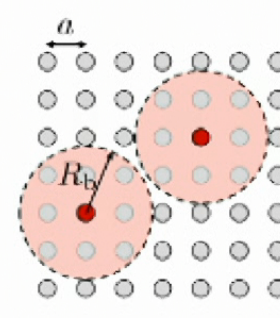
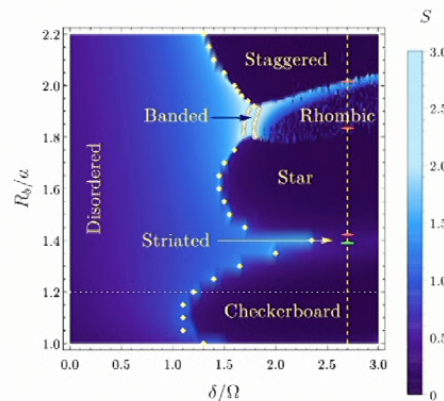


Figure: Reproduced from Browaeys et al. (2020) [1]

Intuition: Within one blockade radius, only one atom is excited.

## The Rydberg phase diagram

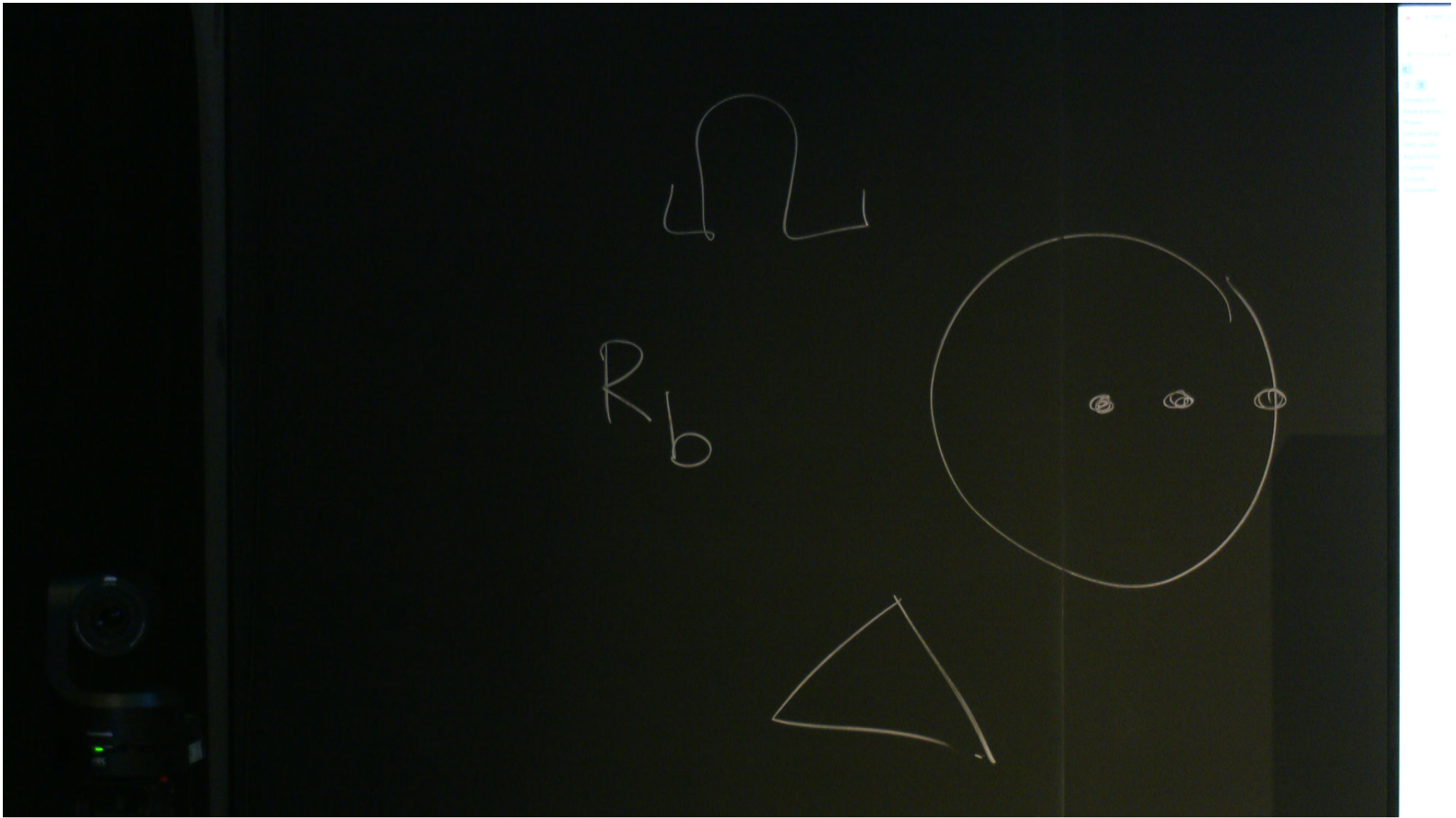
$$\frac{H_{Ryd}(t)}{\hbar} = \frac{\Omega(t)}{2} \sum_i (|g_i\rangle \langle r_i| + |r_i\rangle \langle g_i|) - \Delta(t) \sum_i n_i + \sum_{i<j} \frac{C_6}{r_{ij}^6} n_i n_j.$$



Competition between (positive) detuning, parameterized by  $\Delta/\Omega$ ,

and **blockade effect**, originating from **atom-atom interaction**, parameterized by  $R_b/a$ .

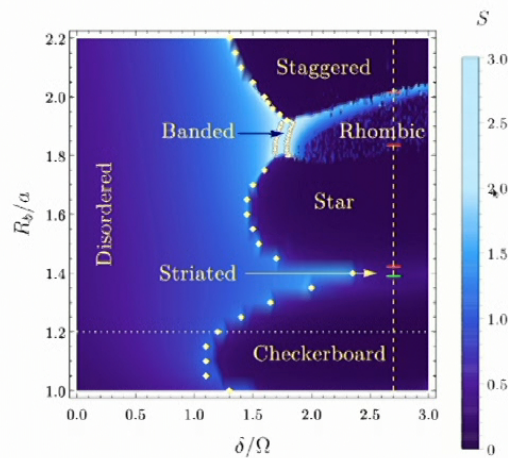
Figure: Reproduced from Samajdar et al. (2020) [5].  $\delta$  is equivalent to  $\Delta$  in our notation,  $a$  is the lattice spacing between individual atoms.



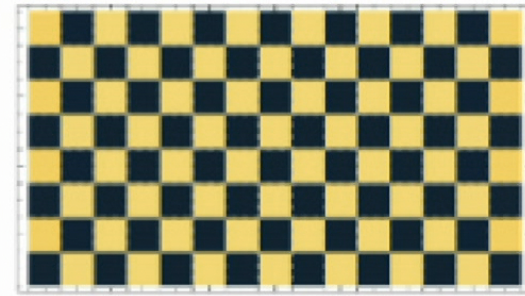


# The Rydberg phase diagram: Ordered phases

Competition between (positive) detuning, parameterized by  $\Delta/\Omega$ , and blockade effect, originating from atom-atom interaction, parameterized by  $R_b/a$ .



(a) Full Rydberg phase diagram.

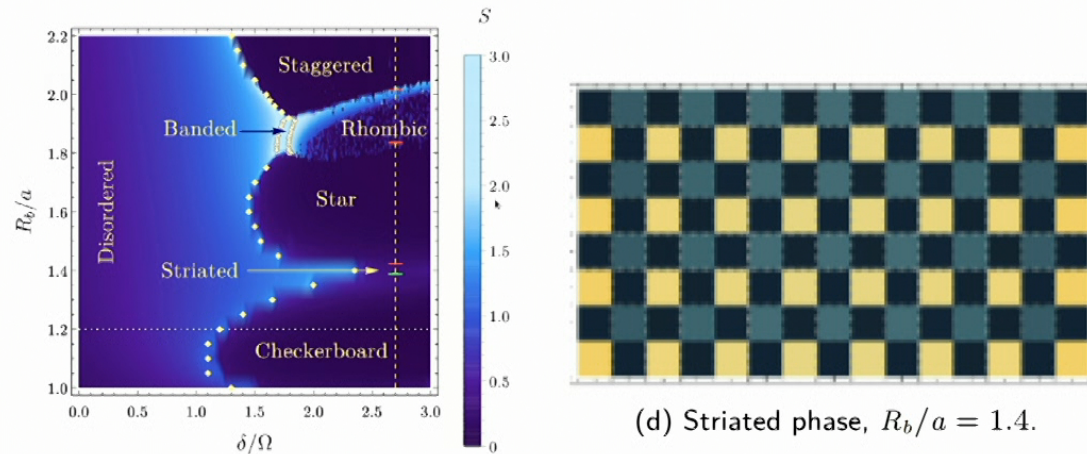


(b) Checkerboard phase,  $R_b/a = 1.2$ .

Figures reproduced from Samajdar et al. (2020) [5]. Yellow corresponds to an excited atom in a Rydberg state, dark blue to a ground state atom.

# The Rydberg phase diagram: Ordered phases

Competition between (positive) detuning, parameterized by  $\Delta/\Omega$ , and blockade effect, originating from atom-atom interaction, parameterized by  $R_b/a$ .



(c) Full Rydberg phase diagram.

(d) Striated phase,  $R_b/a = 1.4$ .

Figures reproduced from Samajdar et al. (2020) [5]. Yellow corresponds to an excited atom in a Rydberg state, dark blue to a ground state atom and light blue indicates quantum fluctuations.



# The Rydberg phase diagram: Not just theory!

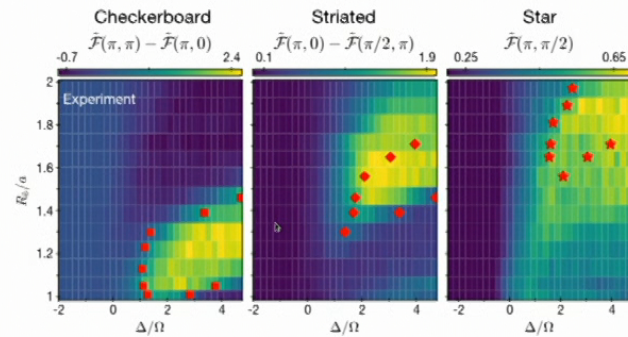


Figure: Experimental detection of ordered phases, reproduced from Ebadi et al. (2020) [2].

## The Rydberg phase diagram: Not just theory!

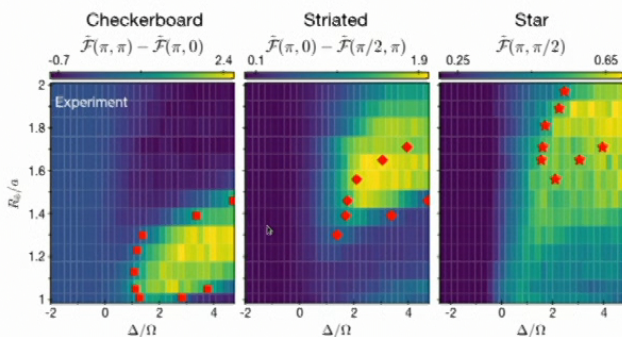


Figure: Experimental detection of ordered phases, reproduced from Ebadi et al. (2020) [2].

The Rydberg phase diagram is currently being investigated using a multitude of methods: theoretical, numerical and experimental. Numerical simulation methods include DMRG, tensor networks and Quantum Monte Carlo (QMC).





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# The Essence of QMC: Making the intractable tractable

- ▶ Monte Carlo:
  - ▶ can solve challenging problems involving probability distributions (e.g. high-dimensional integration or quantum mechanical expectation values)
  - ▶ by **sampling** from the distribution

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# The Essence of QMC: Making the intractable tractable

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- ▶ Markov Chain Monte Carlo:
  - ▶ instead of drawing samples *randomly*...
  - ▶ ... generate a chain of samples to find the important parts of configuration space

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  - ▶ Markov Chain Monte Carlo:
    - ▶ instead of drawing samples *randomly*...
    - ▶ ... generate a chain of samples to find the important parts of configuration space
- 😊 More efficient!
- 😞 Correlated samples!

A QMC study of the Rydberg phase diagram



# The Essence of QMC: Making the intractable tractable

- ▶ Quantum Monte Carlo: classical (i.e. does *not* run on quantum hardware!) method of applying stochastic Monte Carlo approach to solve a quantum many-body problem.
  - ▶ Note: QMC is an umbrella term and subsumes many different flavors of implementation, each tailored to solve a specific type of problem as efficiently as possible.

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A QMC study of the Rydberg

file:///home/anna/Downloads/P8I\_Pres\_conference-1.pdf

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# Our QMC flavor: Stochastic Series Expansion (SSE)

Check out: *Stochastic Series Expansion Quantum Monte Carlo for Rydberg Arrays* (Merali et al. 2023, arxiv:2107.00766)



**BLOQADE**

Search docs

Manual

- Lattices
- Waveforms
- Hamiltonians
- Registers and Observables
- Emulation
- Working with Subspace

Tutorials / Quantum Monte Carlo Method [Edit on GitHub](#)

## Quantum Monte Carlo Method

In previous tutorials such as the [Adiabatic Evolution](#) one, [Exact Diagonalization \(ED\)](#) was used to produce the results. While ED is numerically exact and works for smaller systems consisting of tens of atoms it scales poorly. An alternative method that Bloqade supports is Quantum Monte Carlo (QMC) under the BloqadeQMC module which can scale to hundreds of atoms with the caveat that it is exact up to statistical errors.

It is worth clarifying that despite the name, QMC is a purely classical method that uses the Monte Carlo (MC) approach towards problems in quantum physics. To provide more context, the space we are generating samples from is a Hilbert space of quantum-mechanical configurations. Furthermore, QMC is one of the best established methods in numerically tackling the analytically intractable integrals of quantum many-body physics that are beyond the reach of exact solutions.

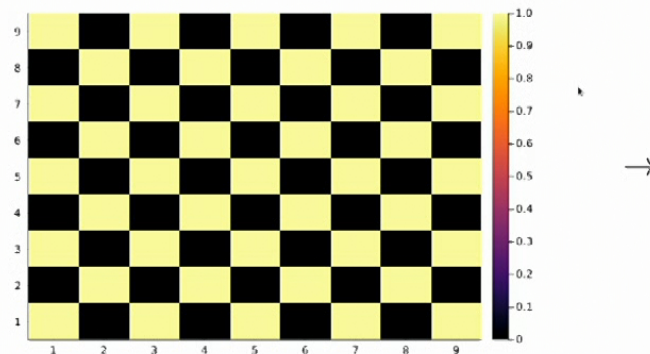
Figure: Check out the BloqadeQMC tutorial! 🍷

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# Order parameters

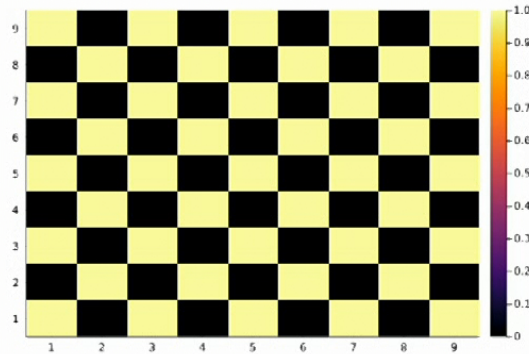
For an ideal checkerboard pattern:



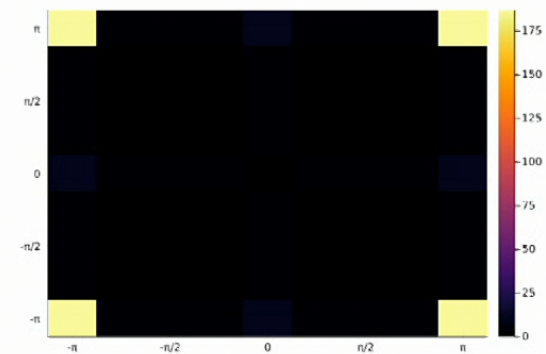
Real space density  $\langle n_i \rangle$

# Order parameters

For an ideal checkerboard pattern:



Real space density  $\langle n_i \rangle$



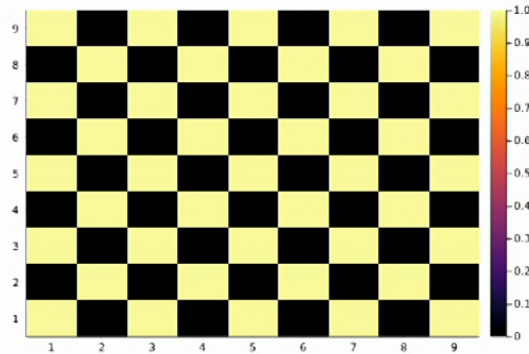
Fourier transform of  $\langle n_i n_j \rangle - \langle n_i \rangle \langle n_j \rangle$

→ FT is a more compact, compressed representation of the same data.

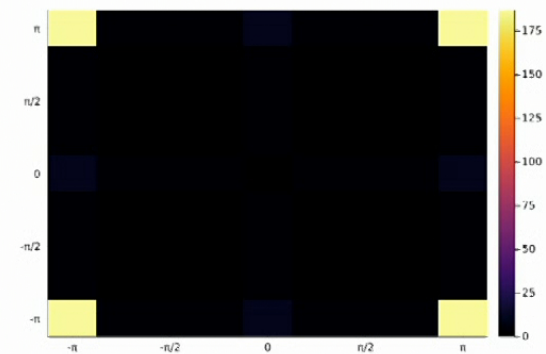


## Order parameters: Peaks in Fourier spectrum

For an ideal checkerboard pattern: Peaks at  $(\pi, \pi)$  and  $90^\circ$ -rotated counterparts.



Real space density  $\langle n_i \rangle$

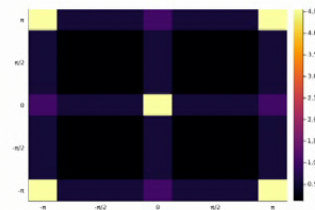


Fourier transform of  $\langle n_i n_j \rangle - \langle n_i \rangle \langle n_j \rangle$

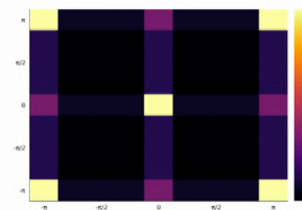
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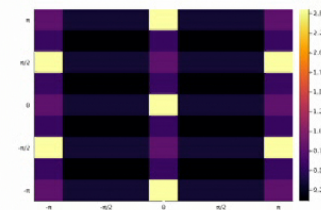
# Order parameters



(a) Checkerboard spectrum



(b) Striated spectrum



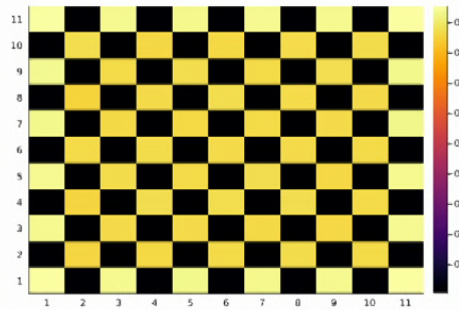
(c) Star spectrum

Figure: Fourier transforms of  $\langle n_i \rangle$ .

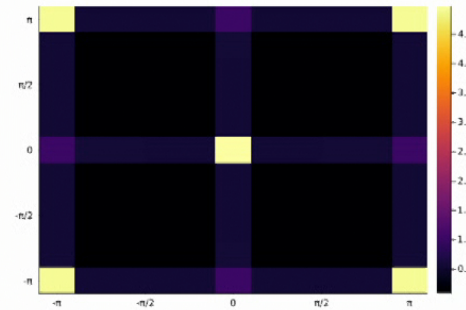
Checkerboard	$(\pi, \pi)$
Striated	$(0, \pi), (\pi, \pi)$
Star	$\pm(\pi/2, \pi), (\pi, 0)$

Table: Summary of expected peaks in Fourier spectrum of the one/two-point density function.

# QMC Results: Checkerboard phase 🍌



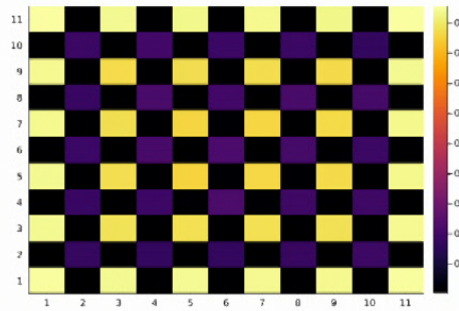
(a) Real space density



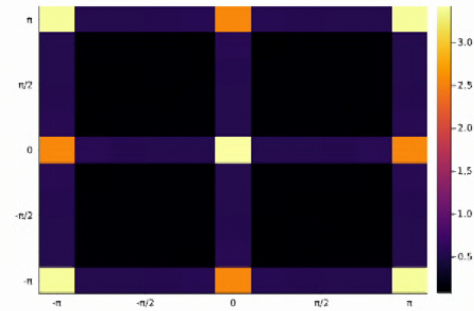
(b) FT of  $\langle n_i \rangle$

Figure: Checkerboard pattern detected at  $R_b/a = 1.2$ ,  $\Delta/\Omega = 2.7$

# QMC Results: Striated phase 👍



(a) Real space density

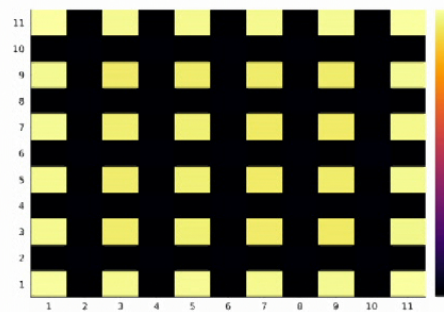


(b) FT of  $\langle n_i \rangle$

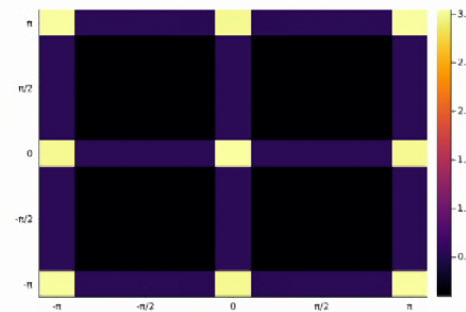
Figure: Striated pattern detected at  $R_b/a = 1.4, \Delta/\Omega = 2.7$



## QMC search for star phase 🤔



(a) Real space density



(b) FT of  $\langle n_i \rangle$

Figure: Parameter values:  $R_b/a = 1.6$ ,  $\Delta/\Omega = 2.7$

Instead of star phase, rather striated without quantum fluctuations.

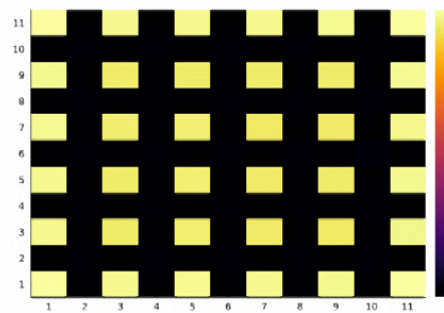
Ergodicity issues? Is the QMC stuck in a local minimum?



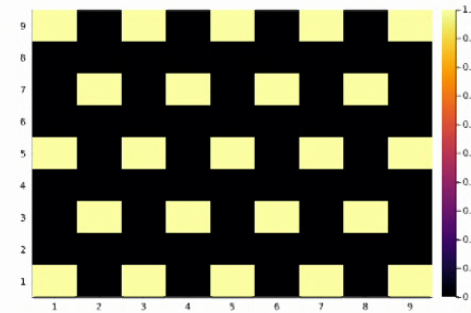
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## QMC search for star phase 🤔



(a) Simulation parameter values:  
 $R_b/a = 1.6, \Delta/\Omega = 2.7$



(b) Ideal star pattern

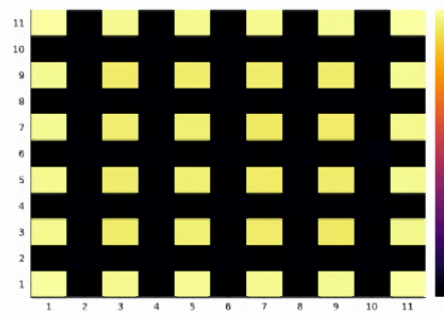
Figure: Comparison of real space densities of local & global minimum configuration.

Instead of star phase, rather striated without quantum fluctuations.

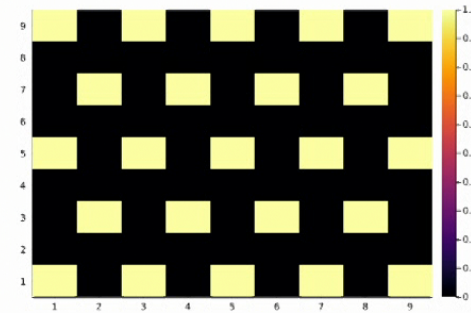
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# Meet QuEra's Aquila processor

- ▶ 256 neutral atom qubits



Figure: The real thing. Photo credits: QuEra Computing Inc.

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## Meet QuEra's Aquila processor

- ▶ 256 neutral atom qubits
- ▶ currently operators in the *analog mode*
  - ▶ uses *continuous* control parameters, instead of discrete gates as in digital mode
- ▶ Architecture: “field programmable qubit array” (FPQA)



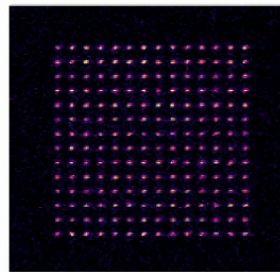
Figure: The real thing. Photo credits: QuEra Computing Inc.

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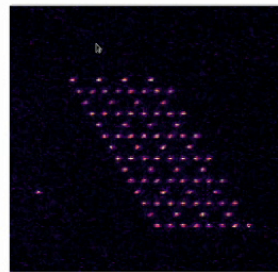
# FPQAs

Atoms can be **moved** individually, using optical tweezers!

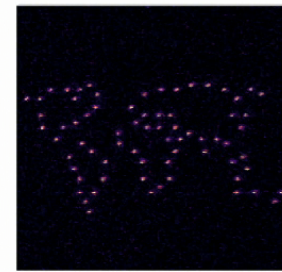
→ Field programmable qubit arrays offer **nearly arbitrary qubit configurations**.



Square lattice



Kagome lattice



World map

Figure: Nearly arbitrary qubit configurations are possible using Aquila!  
Photo credits: QuEra Computing Inc.

## Experimental data from Aquila

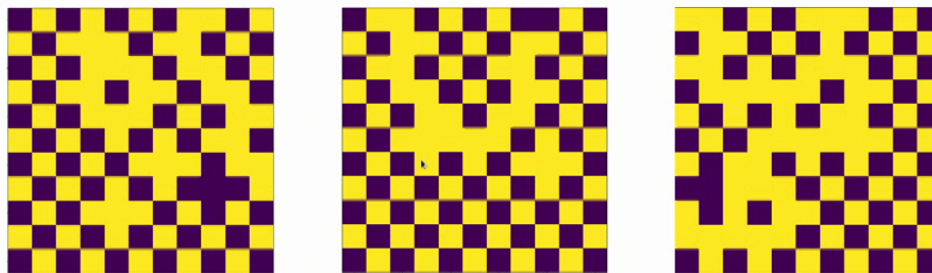
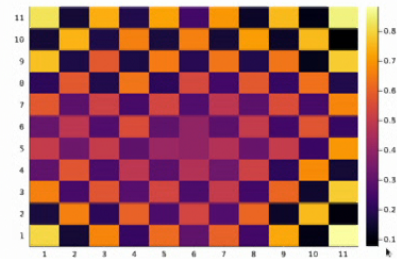


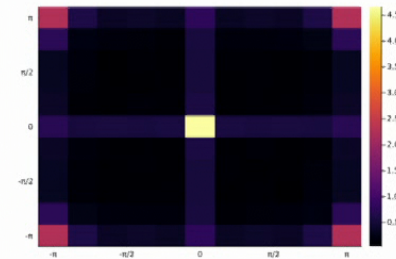
Figure: Individual shots from QuEra's Aquila processor, at  $R_b/a = 1.2$ ,  $\Delta/\Omega = 2.7$ , showing experimental defects.

*Experimental data kindly provided by Fangli Liu & Jonathan Wurtz (QuEra Computing Inc.)*

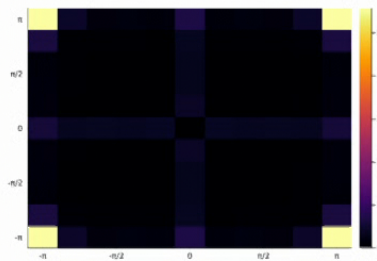
# Comparison with Aquila



(a) Real space density



(b) FT of  $\langle n_i \rangle$



(c) FT of  $\langle n_i n_j \rangle - \langle n_i \rangle \langle n_j \rangle$

Figure: Experimental data from QuEra's Aquila processor at  $R_b/a \approx 1.2$ ,  $\Delta/\Omega = 2.7$ .





# Critical exponents

How can we describe phase transitions?

Scaling hypothesis (for infinite system)

Power-law behavior of observables near the critical point, e.g.

$$\xi \propto |t|^{-\nu}$$
$$m \propto \xi^{-\beta/\nu}$$

Critical exponents describe *how* we cross a phase transition.

# Finite size scaling analysis

Scaling hypothesis... for finite system!

$$m \propto L^{-\beta/\nu} \tilde{m}(L^{1/\nu}|t|).$$

where  $\tilde{m}$  is a universal function, independent of the system size.

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One can further simplify the dependence on L by introducing the Binder cumulant

$$U_4 = \frac{1}{2} \left( 3 - \frac{\langle m_s^4 \rangle}{\langle m_s^2 \rangle^2} \right),$$

governed by the even simpler scaling formula

$$U_4 \propto \tilde{U}_4(L^{1/\nu}(\Delta - \Delta_c)/\Delta_c), \quad (1)$$

where we have now also explicitly replaced the reduced temperature with our actual control parameter, namely the global detuning  $\Delta$ .



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# Finite size scaling analysis

## Step 1: Locating the critical point

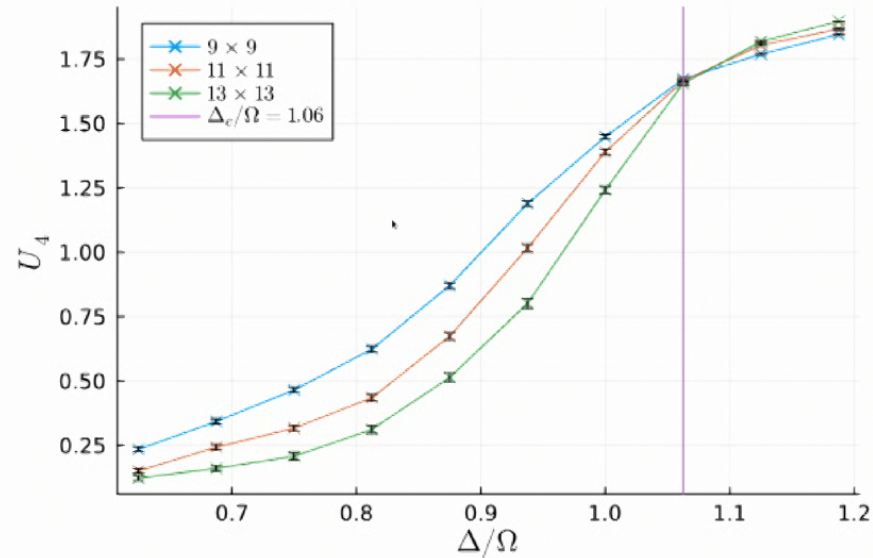


Figure: From plotting the intersection of the Binder cumulant for various system sizes, we find the critical point at  $\Delta_c/\Omega \approx 1.06$ .

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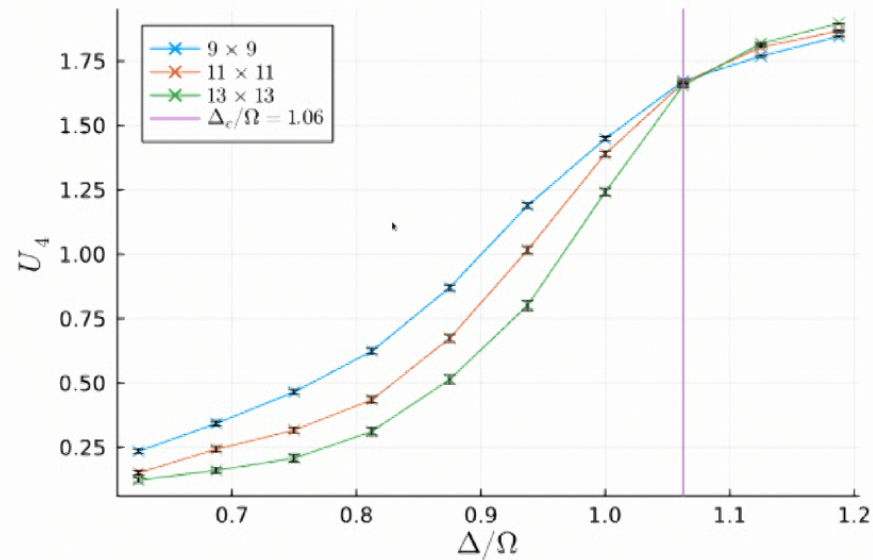
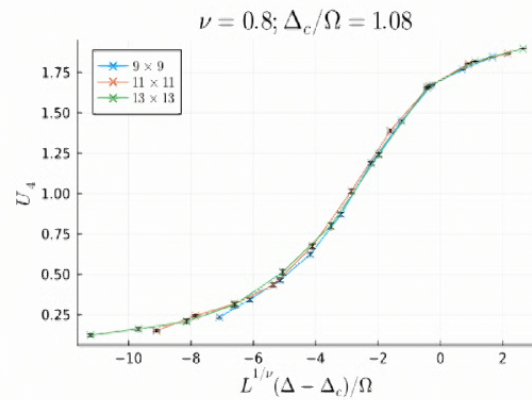


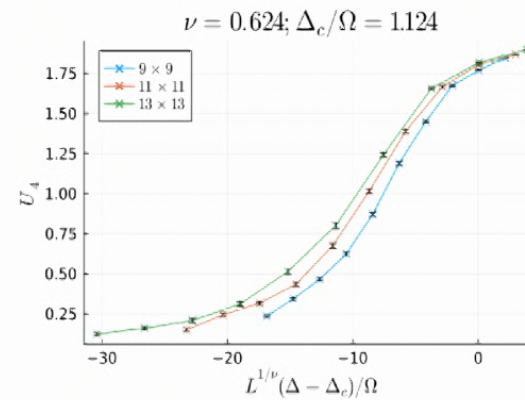
Figure: From plotting the intersection of the Binder cumulant for various system sizes, we find the critical point at  $\Delta_c/\Omega \approx 1.06$ .

# Finite size scaling analysis

## Step 2: Extracting critical exponents



(a) ... optimized parameters from our data, i.e.  $\Delta_c/\Omega \approx 1.08$  and  $\nu \approx 0.8$ .



(b) ... using optimized parameters from Ref. [2], i.e.  $\Delta_c/\Omega \approx 1.124$  and  $\nu \approx 0.624$ .

Figure: Scaling collapse of Binder cumulant using ...



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file:///home/anna/Downloads/P8I\_Pres\_conference-1.pdf

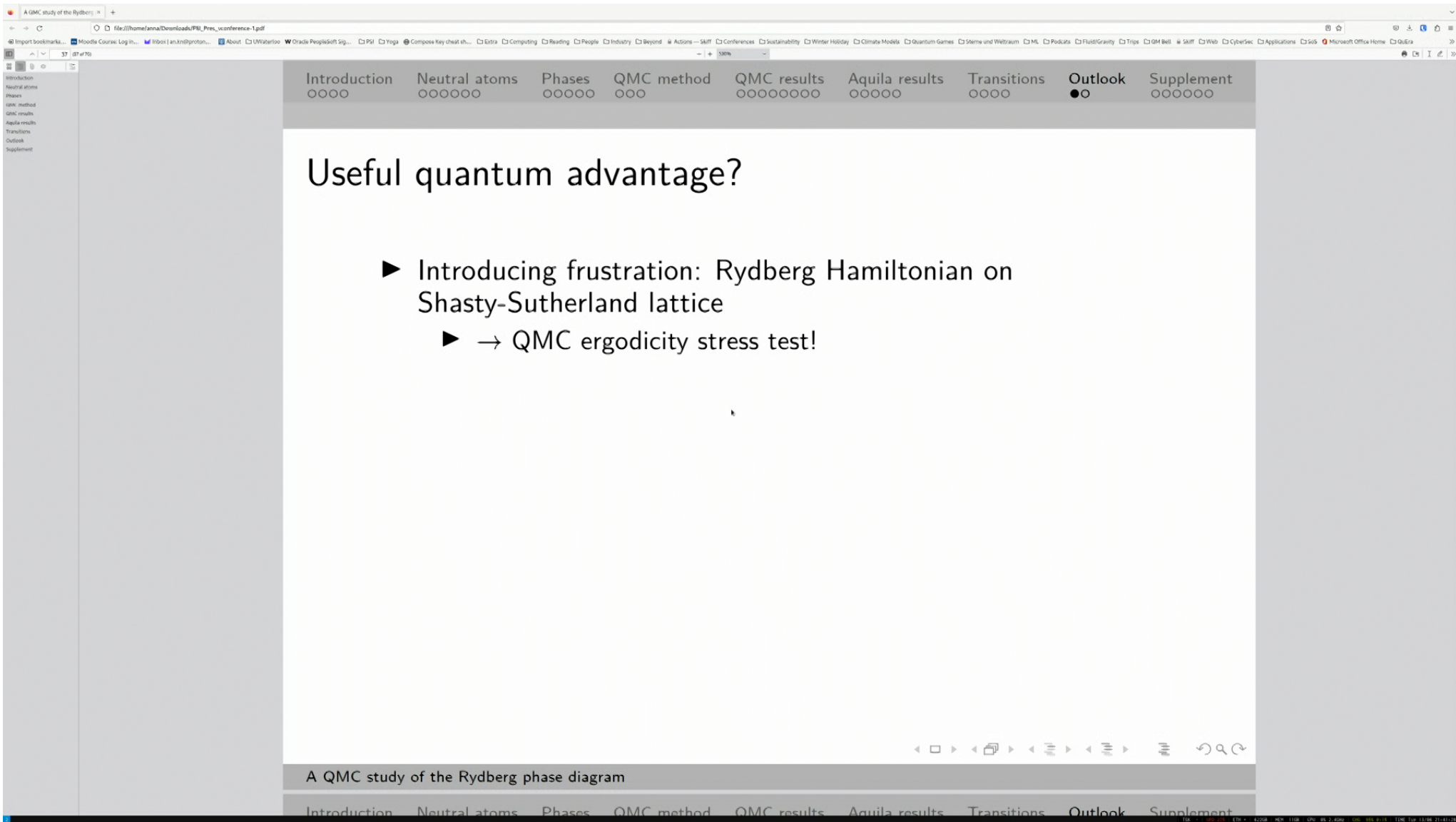
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# Useful quantum advantage?

- ▶ Introducing frustration: Rydberg Hamiltonian on Shasty-Sutherland lattice
  - ▶ → QMC ergodicity stress test!

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## Useful quantum advantage?

- ▶ Introducing frustration: Rydberg Hamiltonian on Shasty-Sutherland lattice
  - ▶ → QMC ergodicity stress test!
- ▶ Beyond QMC: Using neutral atom quantum processor to implement the Heisenberg Hamiltonian
  - ▶ → sign problem for anti-ferromagnetic interaction on the off-diagonal
- ▶ *Analogue* avenues: using neutral atom processor to conduct “experiments by analogy”
  - ▶ → e.g. possible to study hadronization processes

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## Climate table

### Numerical simulations

Total Kernel Hours [h]	8260
Thermal Design Power Per Kernel [W]	5.75
Total Energy Consumption Simulations [kWh]	82
Average Emission Of CO <sub>2</sub> In Germany [kg/kWh]	0.56
Total CO <sub>2</sub> -Emission For Numerical Simulations [kg]	45
Were The Emissions Offset?	<b>Yes</b>

### Transport

Total CO <sub>2</sub> -Emission For Transport [kg]	1050
Were The Emissions Offset?	<b>Yes</b>
Total CO <sub>2</sub> -Emission [kg]	1095

Table: Example of a CO<sub>2</sub>-table that can be included towards the end of a scientific publication. Please also consider referencing [scientific-conduct.github.io](https://scientific-conduct.github.io) to enhance visibility in your community. To be adapted to our project!