

# Kernels and integration cycles in complex Langevin simulations

**Michael Mandl**

with Michael W. Hansen, Dénes Sexty and Erhard Seiler

LATTICE 2024 - 29/07/2024

**FWF** Austrian  
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Wednesday @ 11:55

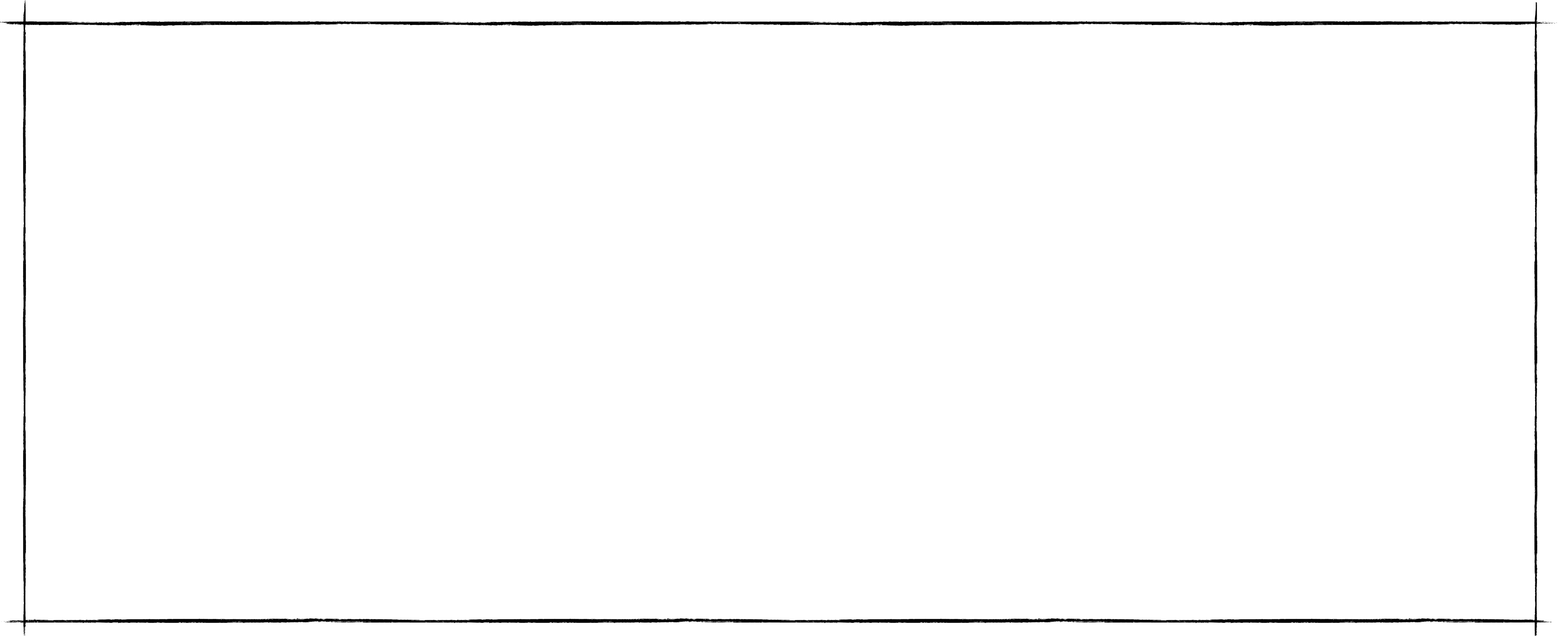
Tuesday @ 15:05

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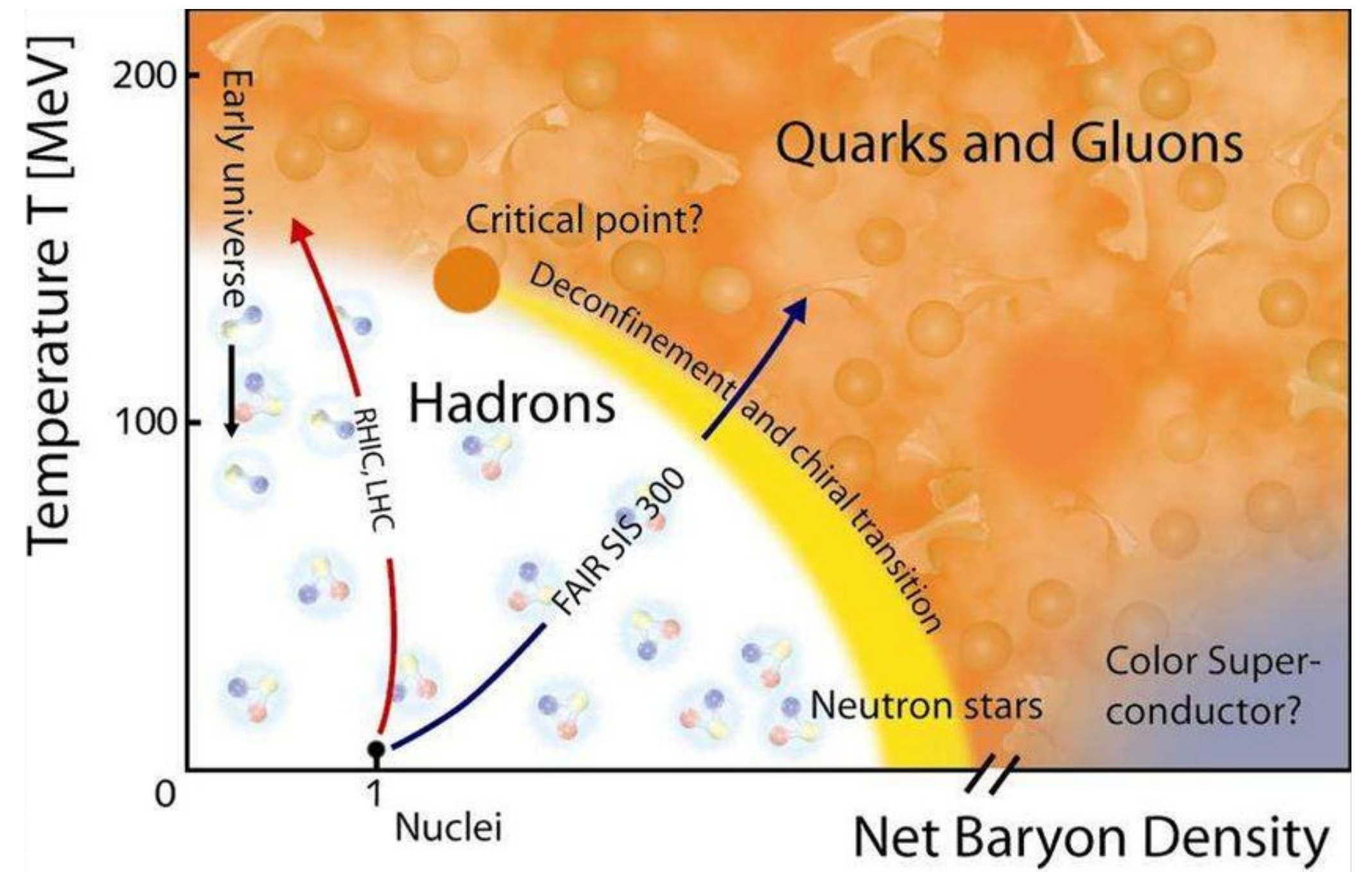
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# Motivation



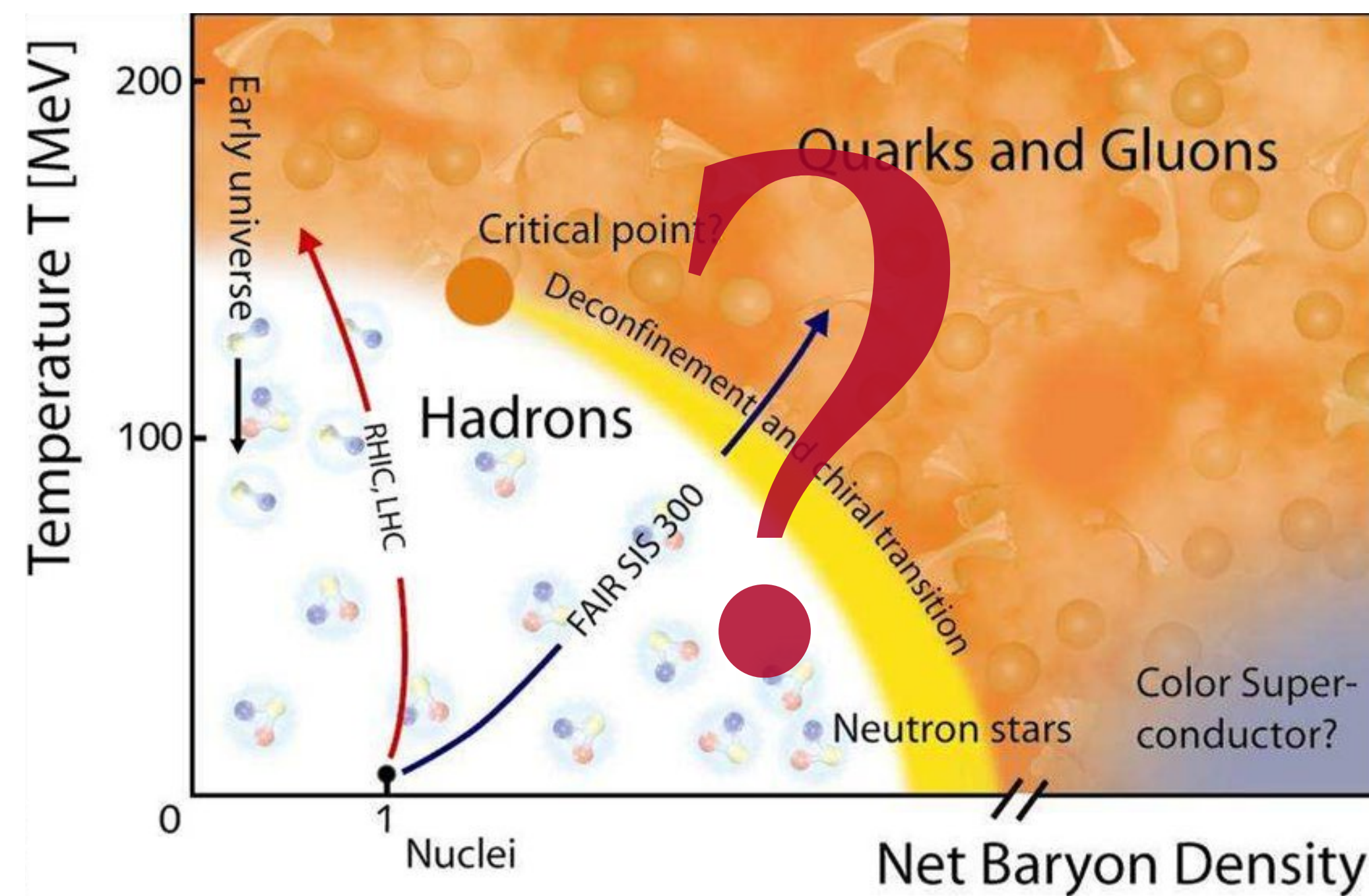
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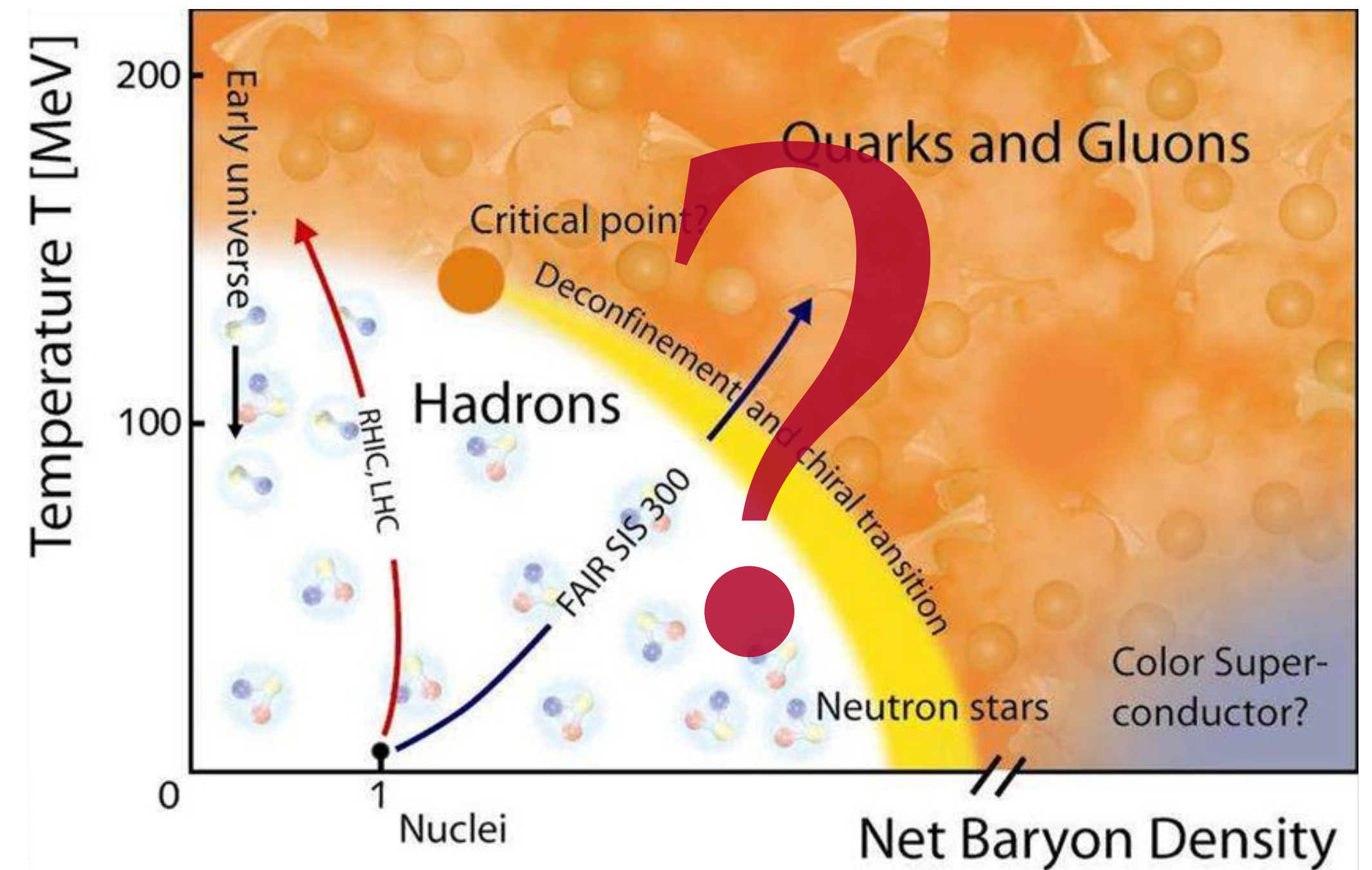
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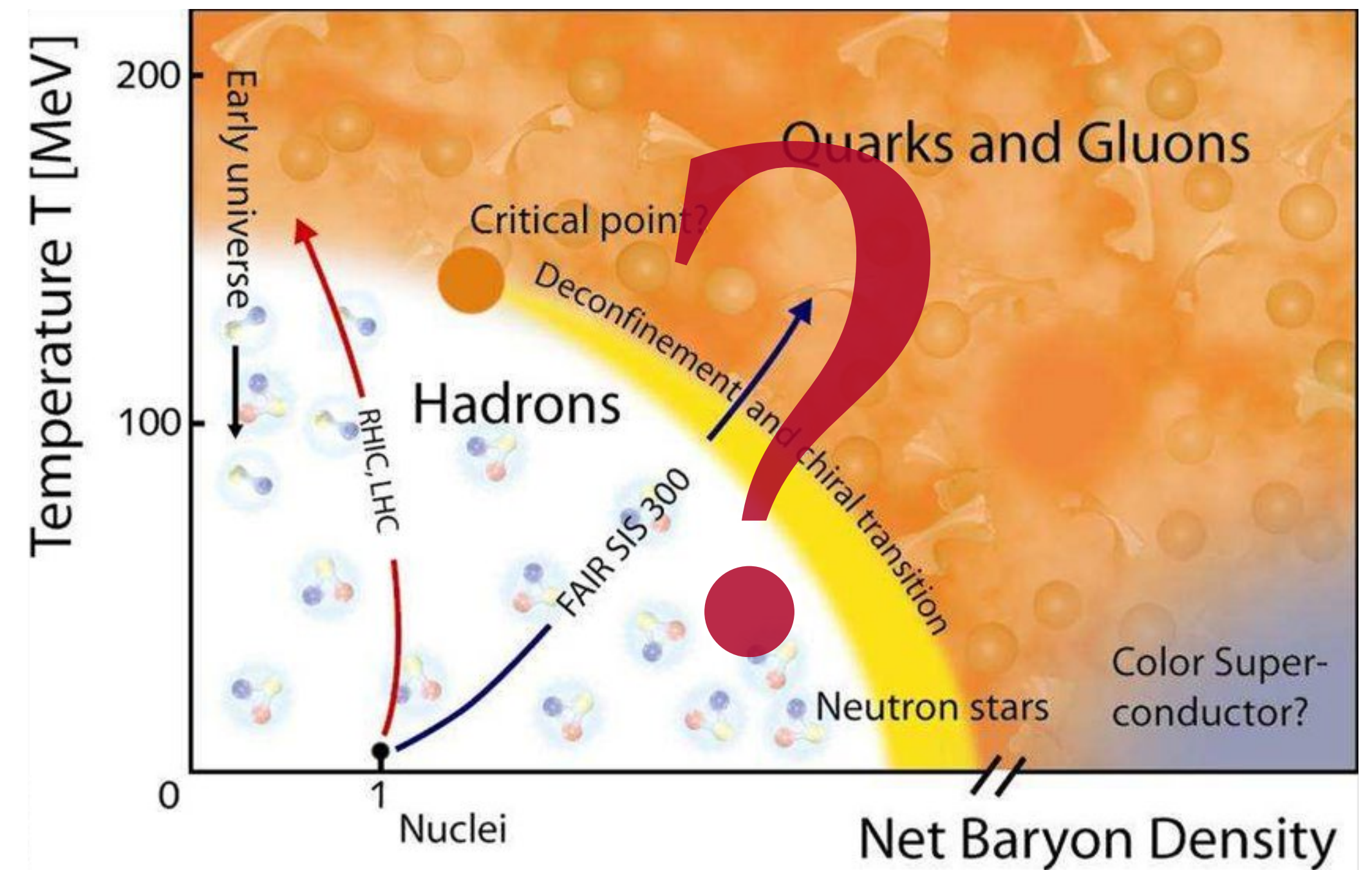




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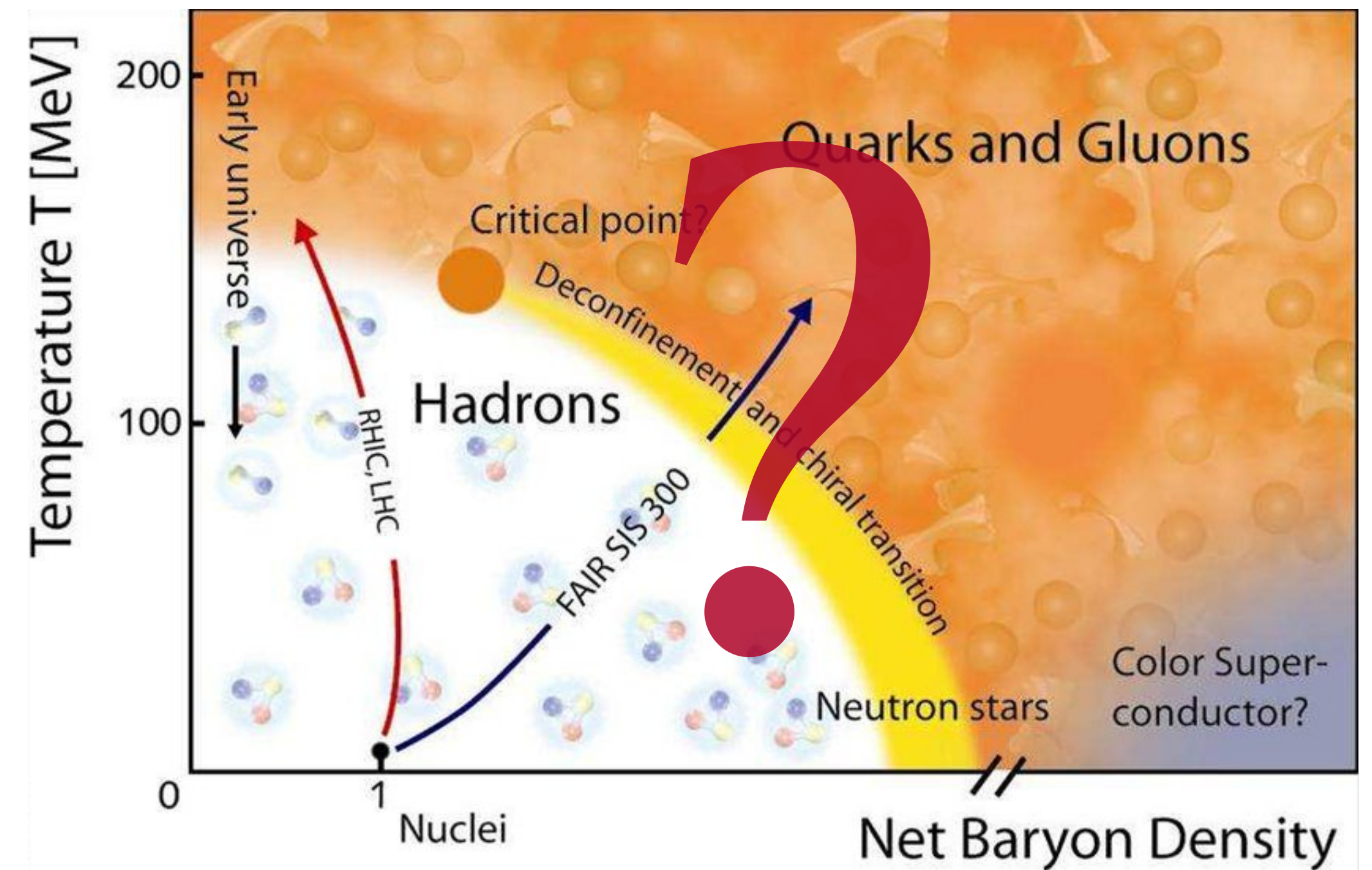


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$$\rho(x) \propto e^{-S(x)} \notin \mathbb{R}$$





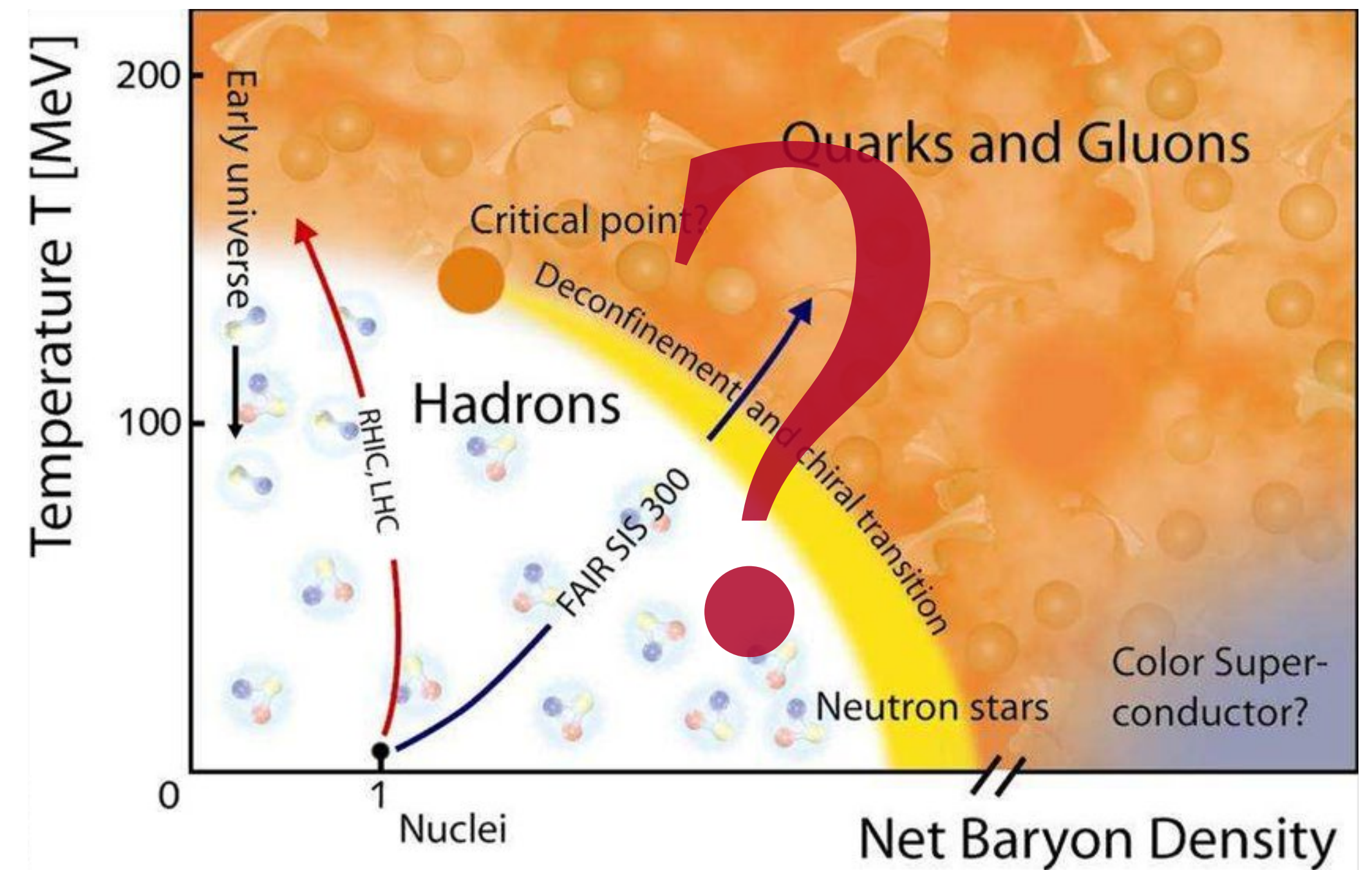
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⇒ probabilistic interpretation lost.

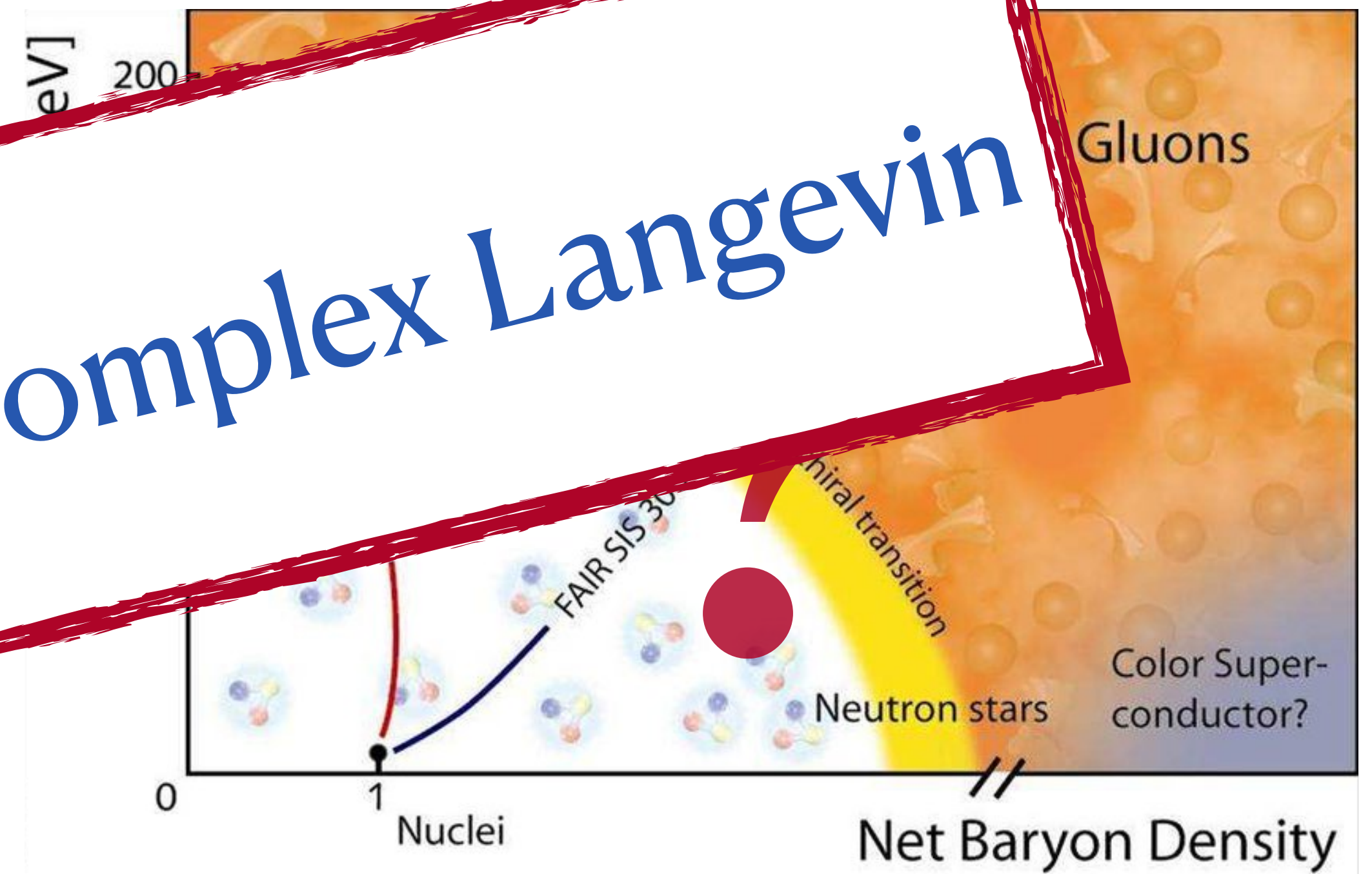


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Possible solution: Complex Langevin

⇒ probability lost.





# The complex Langevin equation

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- Complexify  $x \rightarrow z = x + iy$ , evolve statistical system in fictitious time direction  $\tau$ .



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Gaussian noise:

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Gaussian noise:  
 $\langle \eta(\tau) \rangle = 0$   
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- Obtain target theory  $e^{-S(z)}$  in equilibrium limit  $\tau \rightarrow \infty$ .

# Drawbacks and pitfalls

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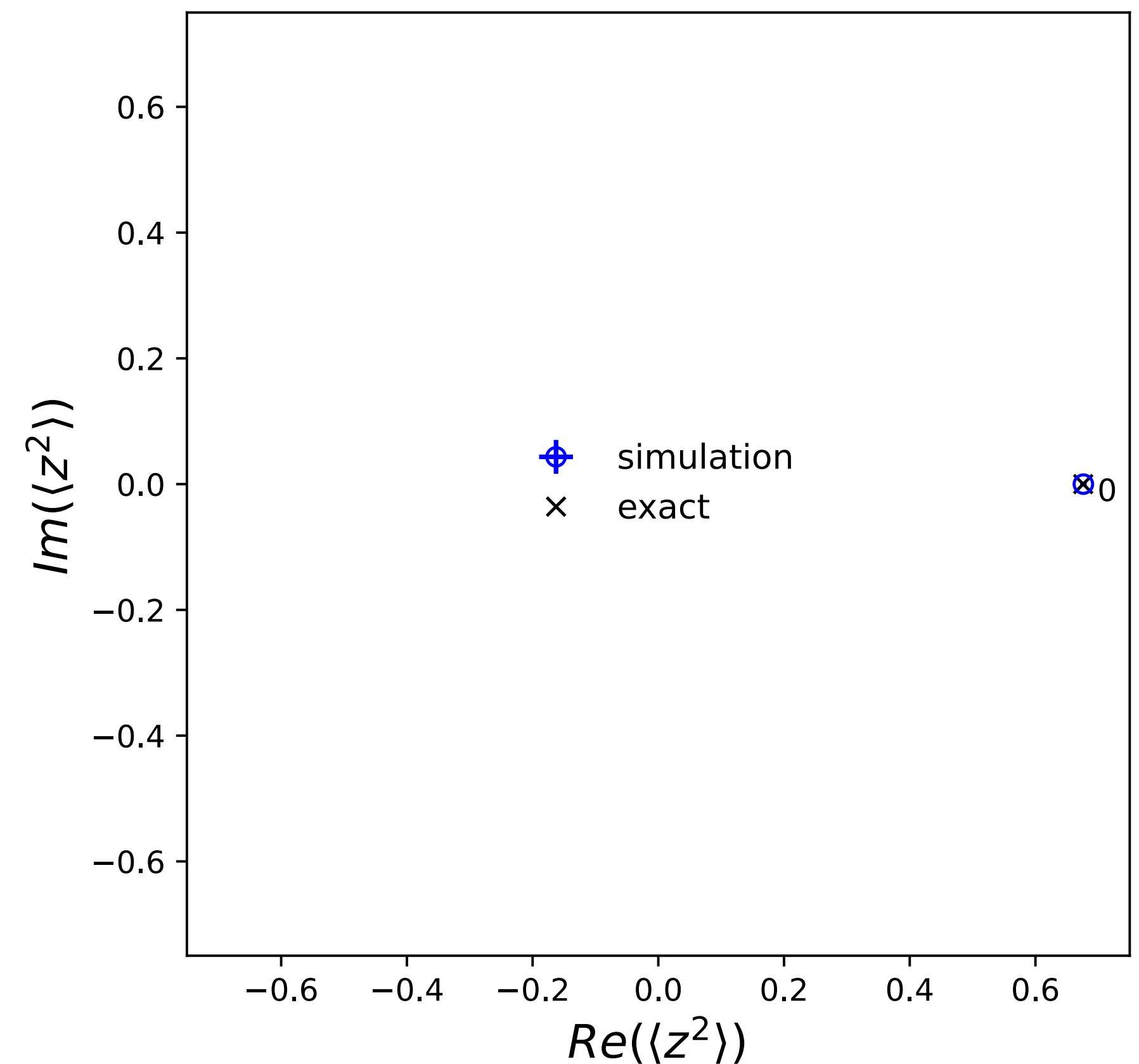
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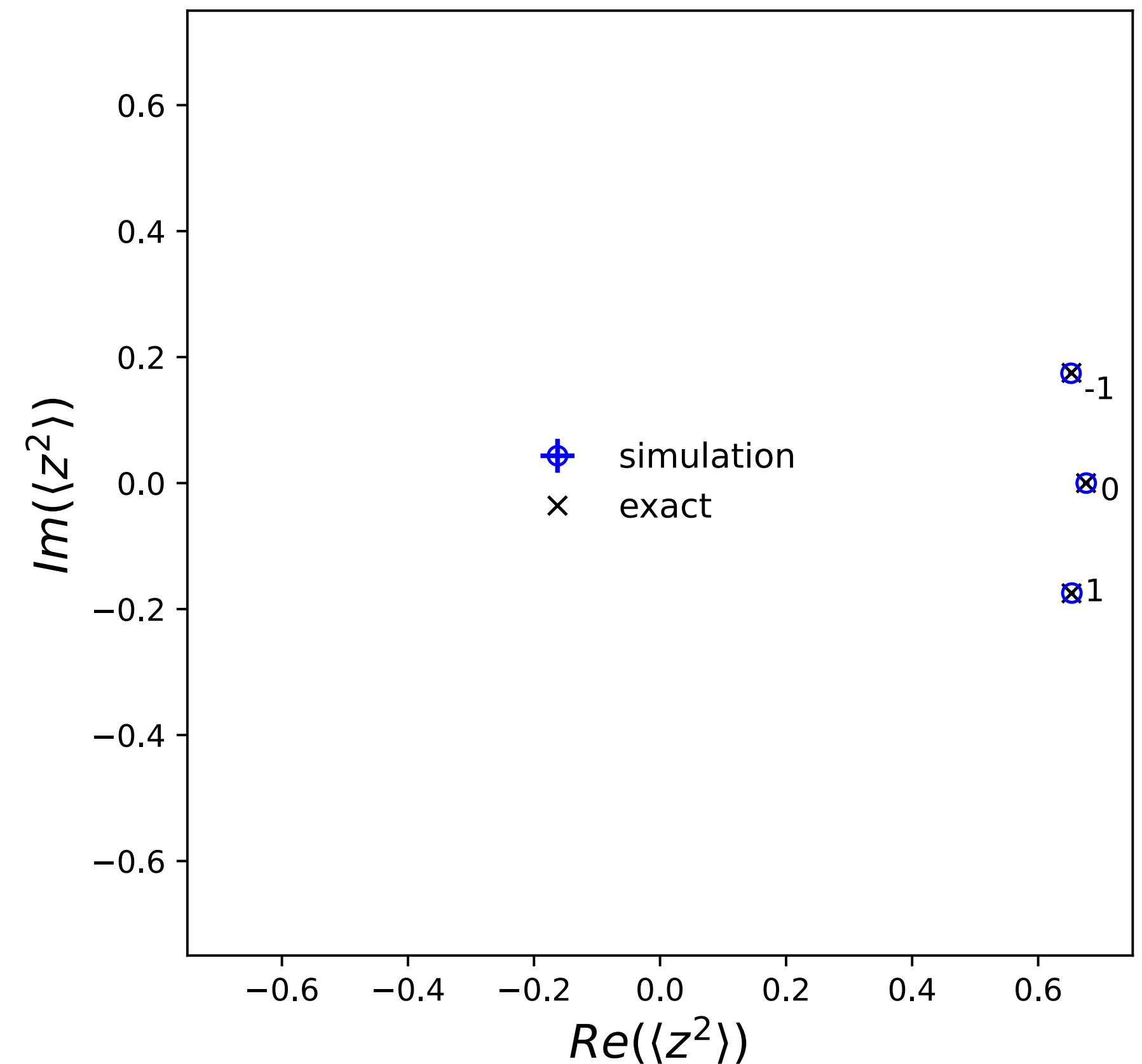


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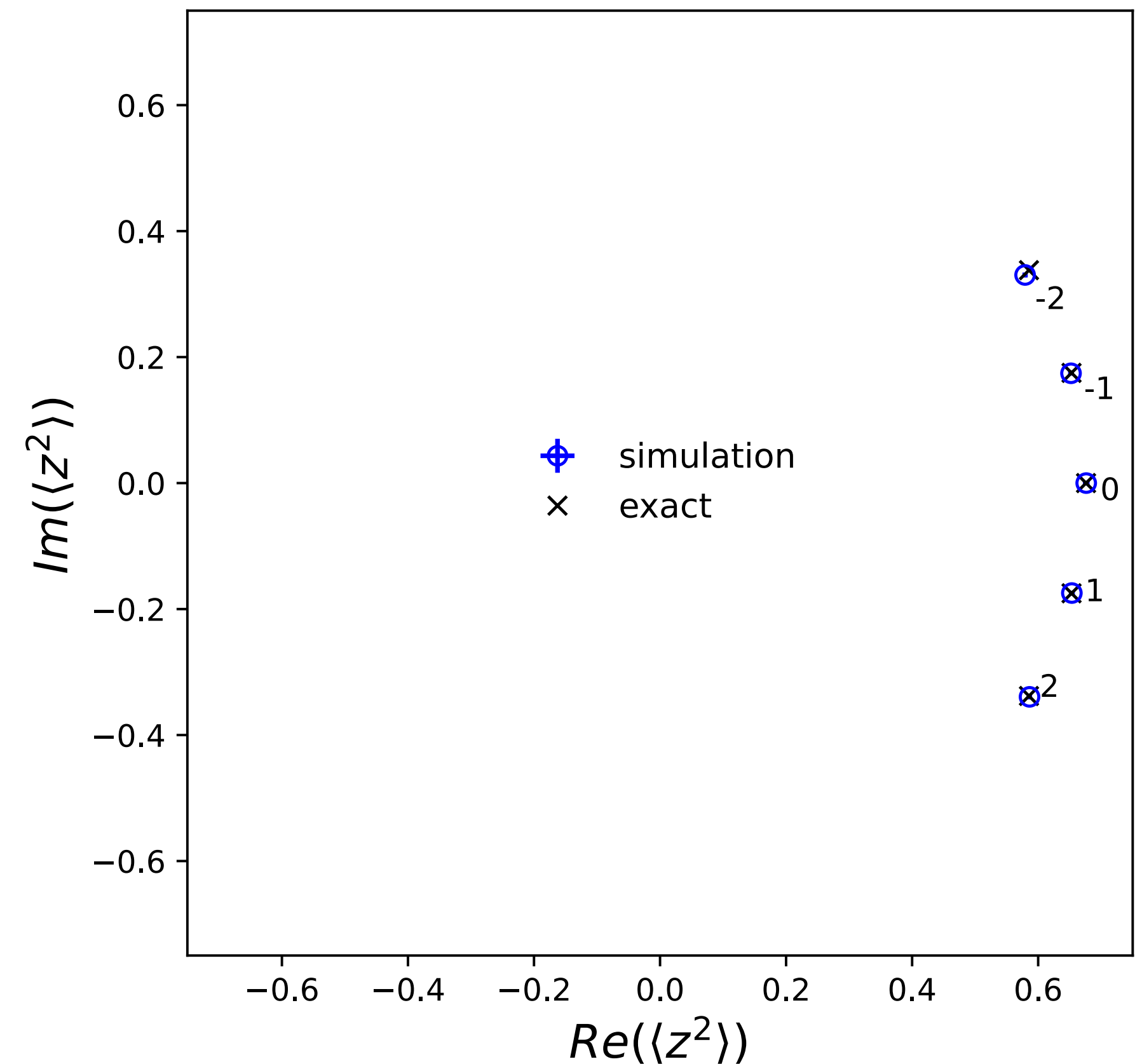


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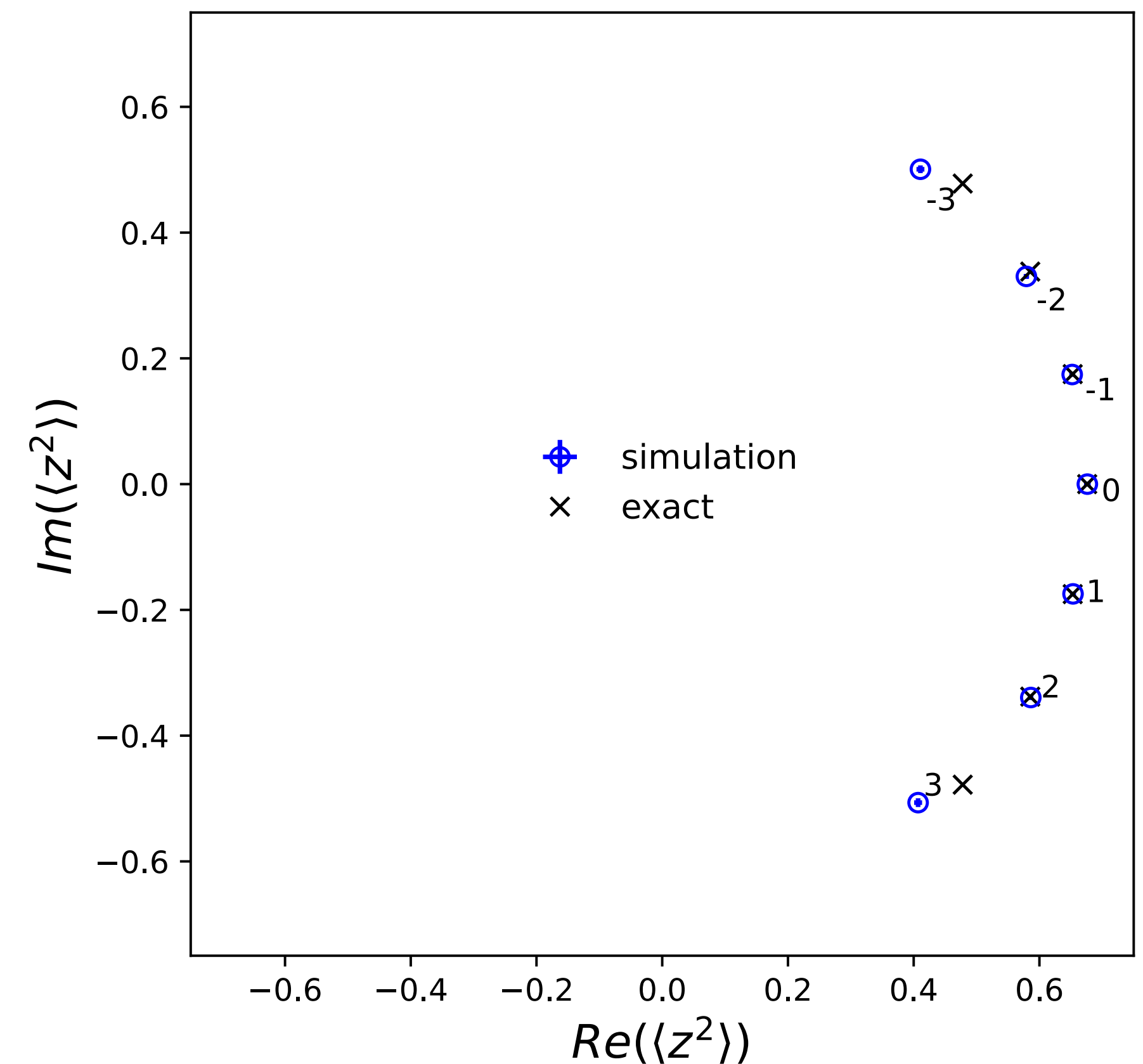


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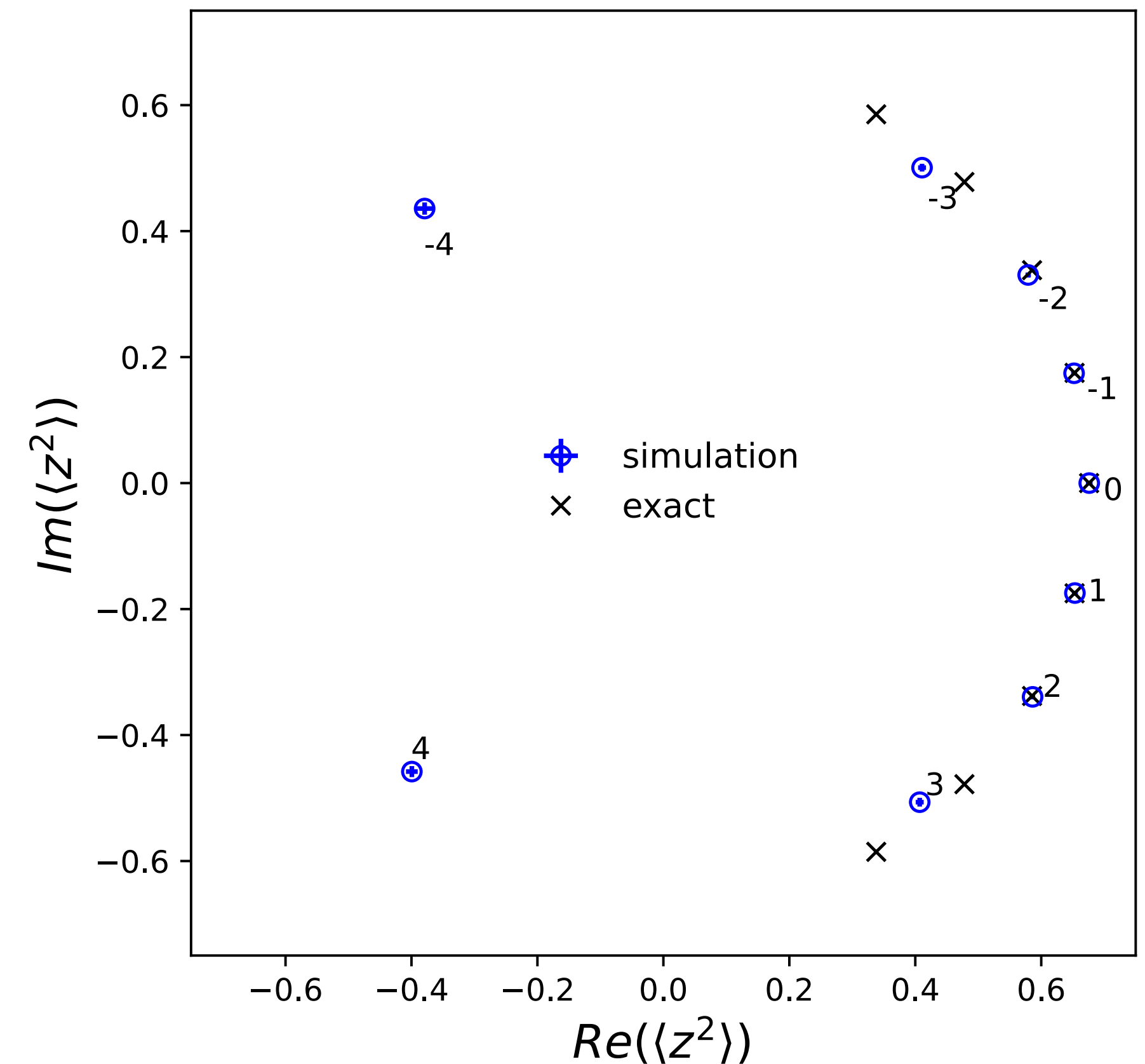


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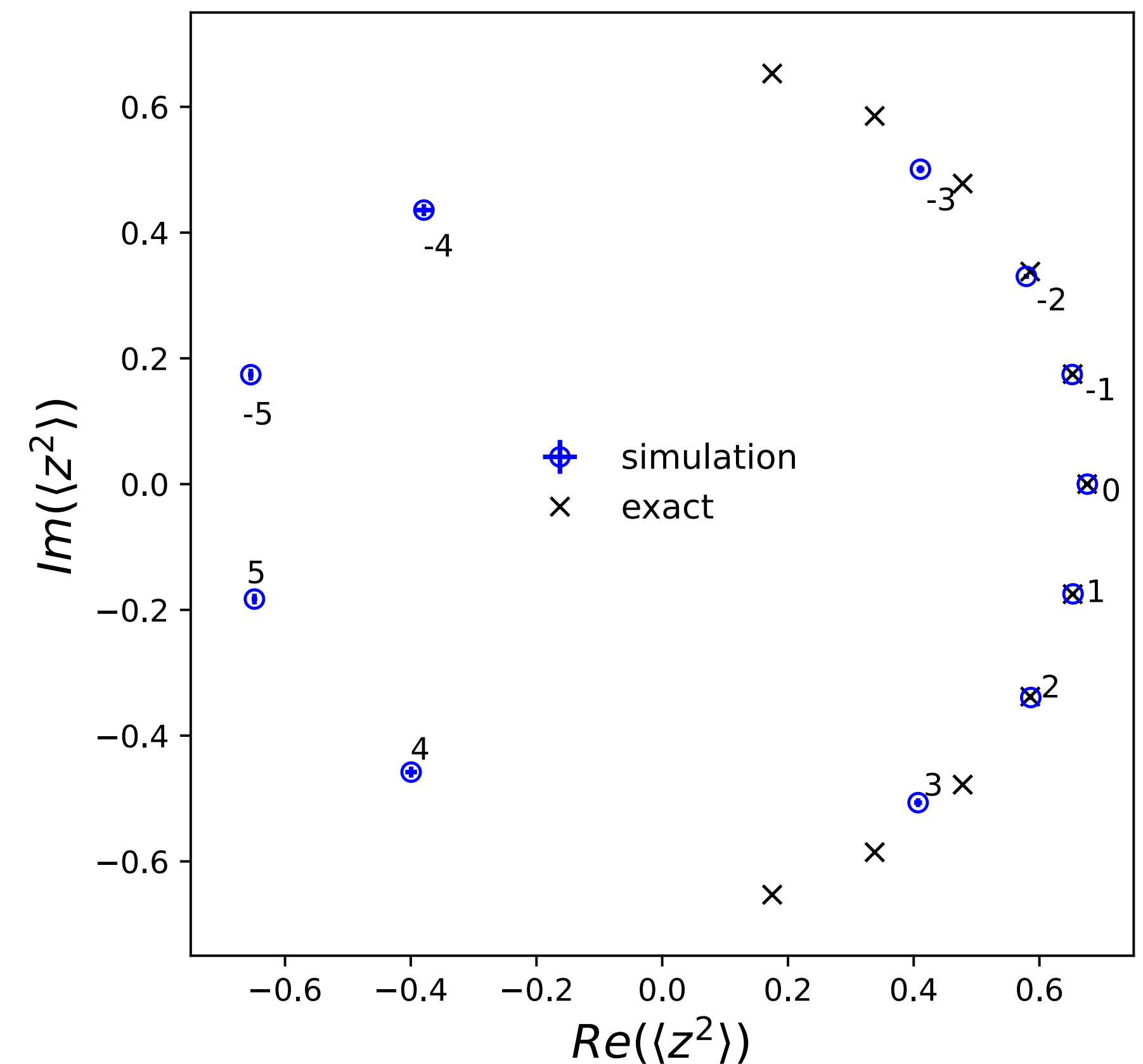


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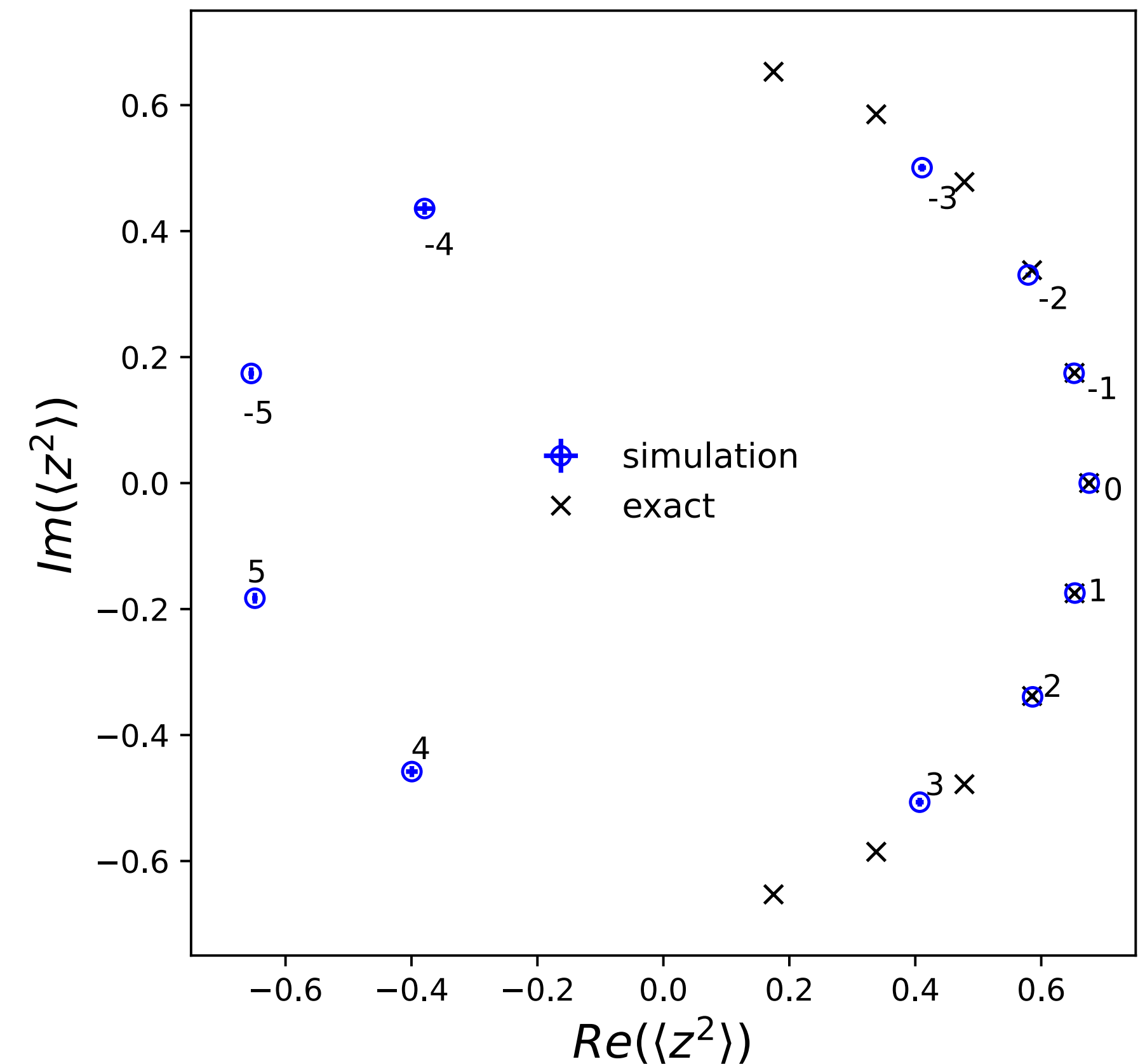
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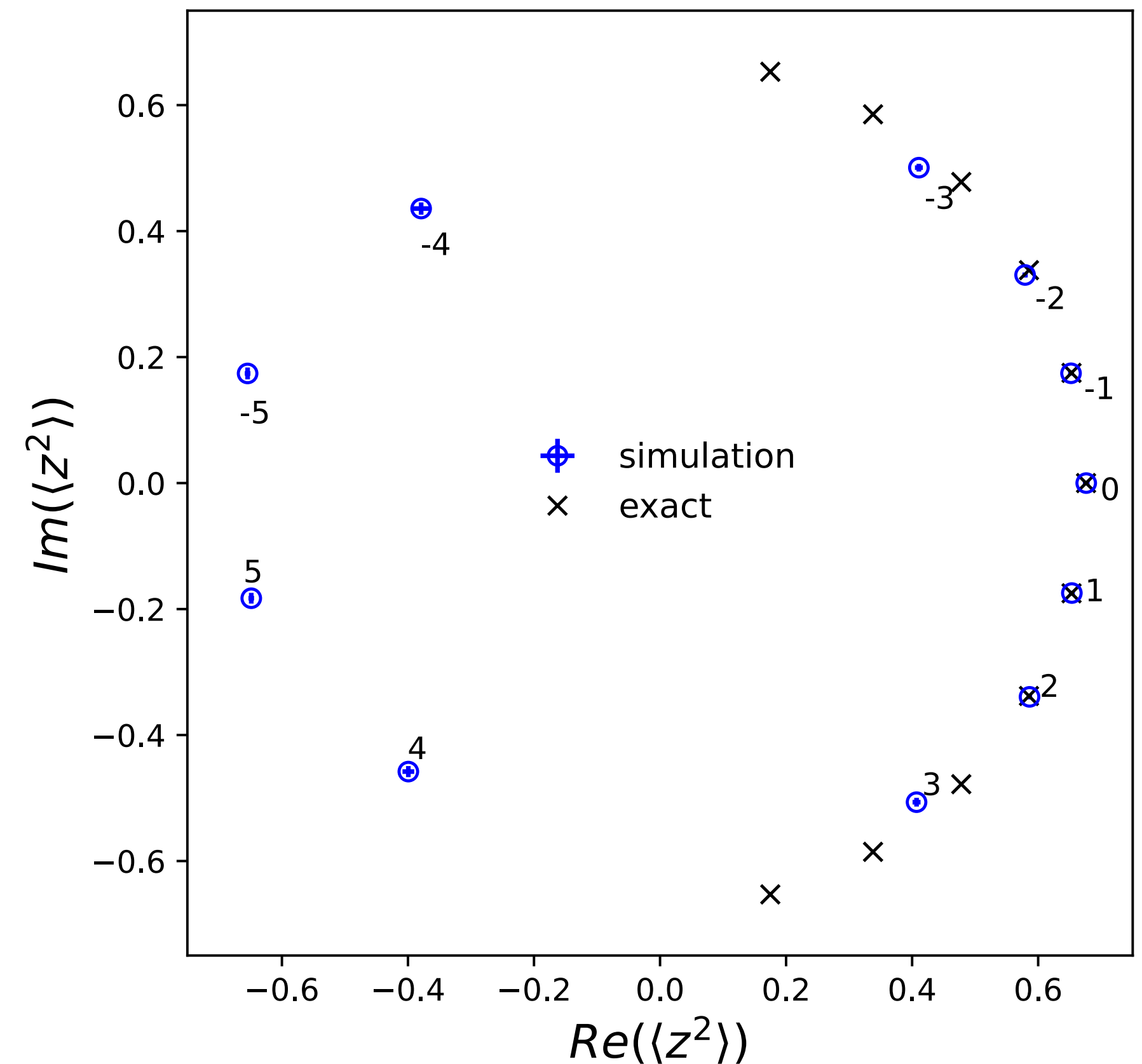




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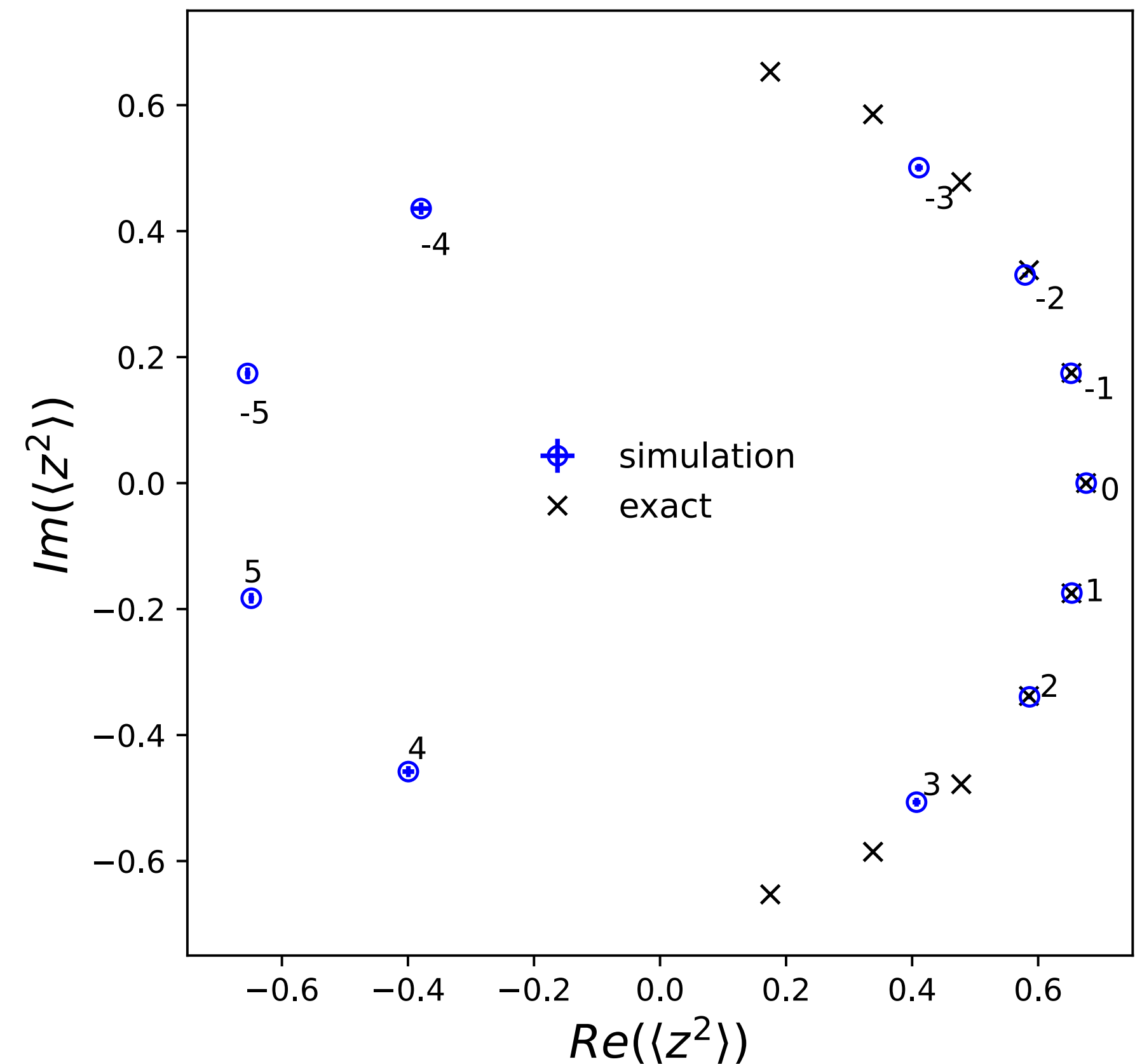
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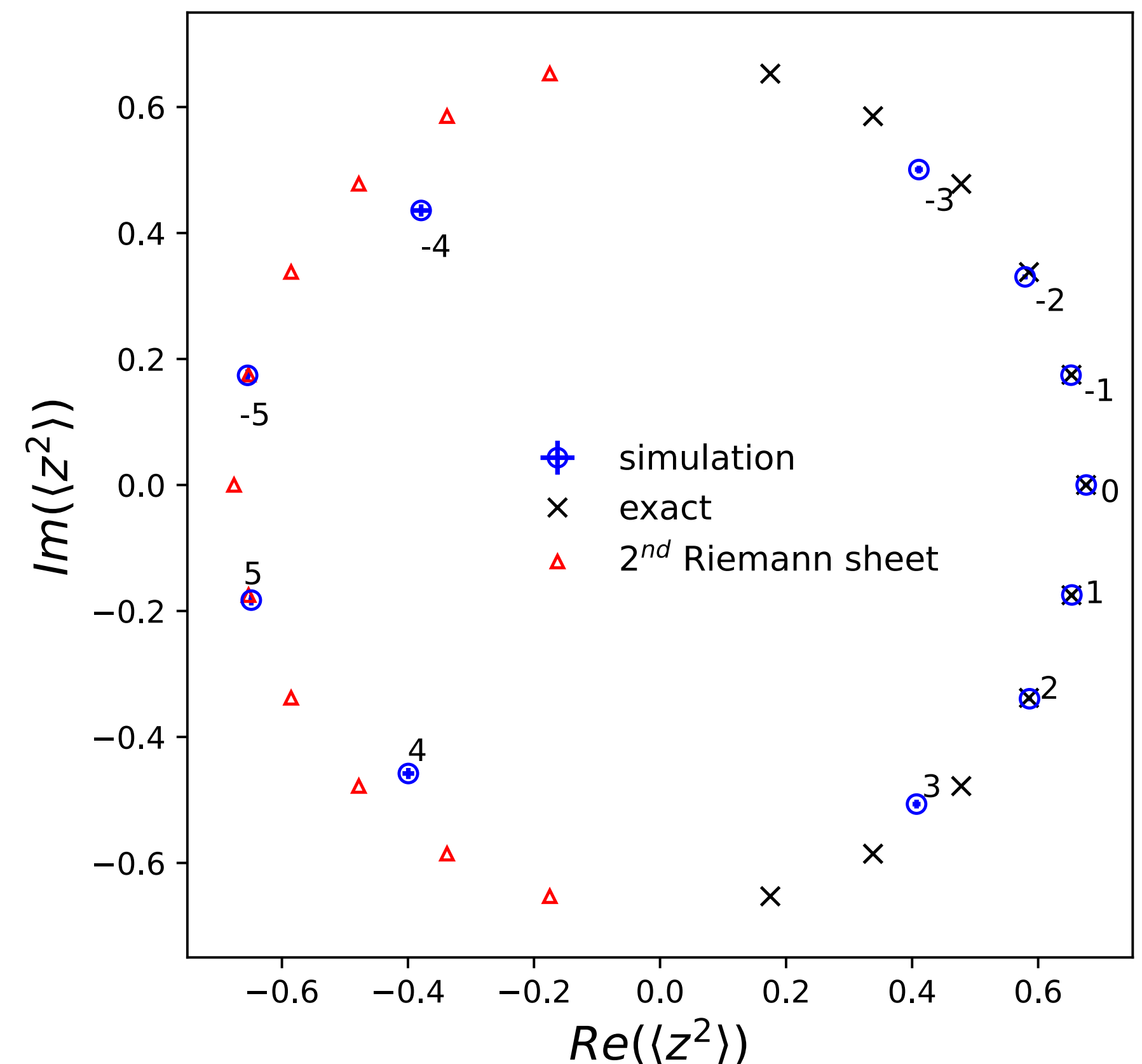
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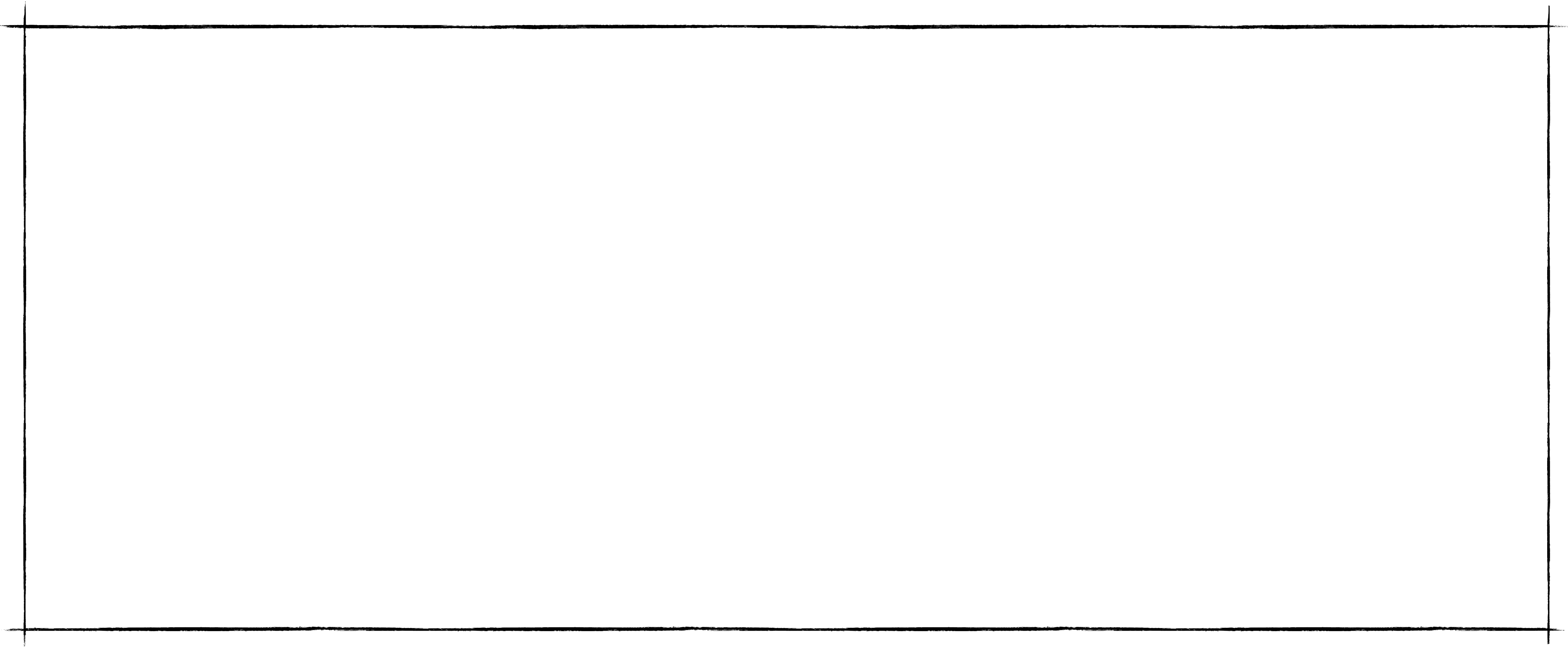
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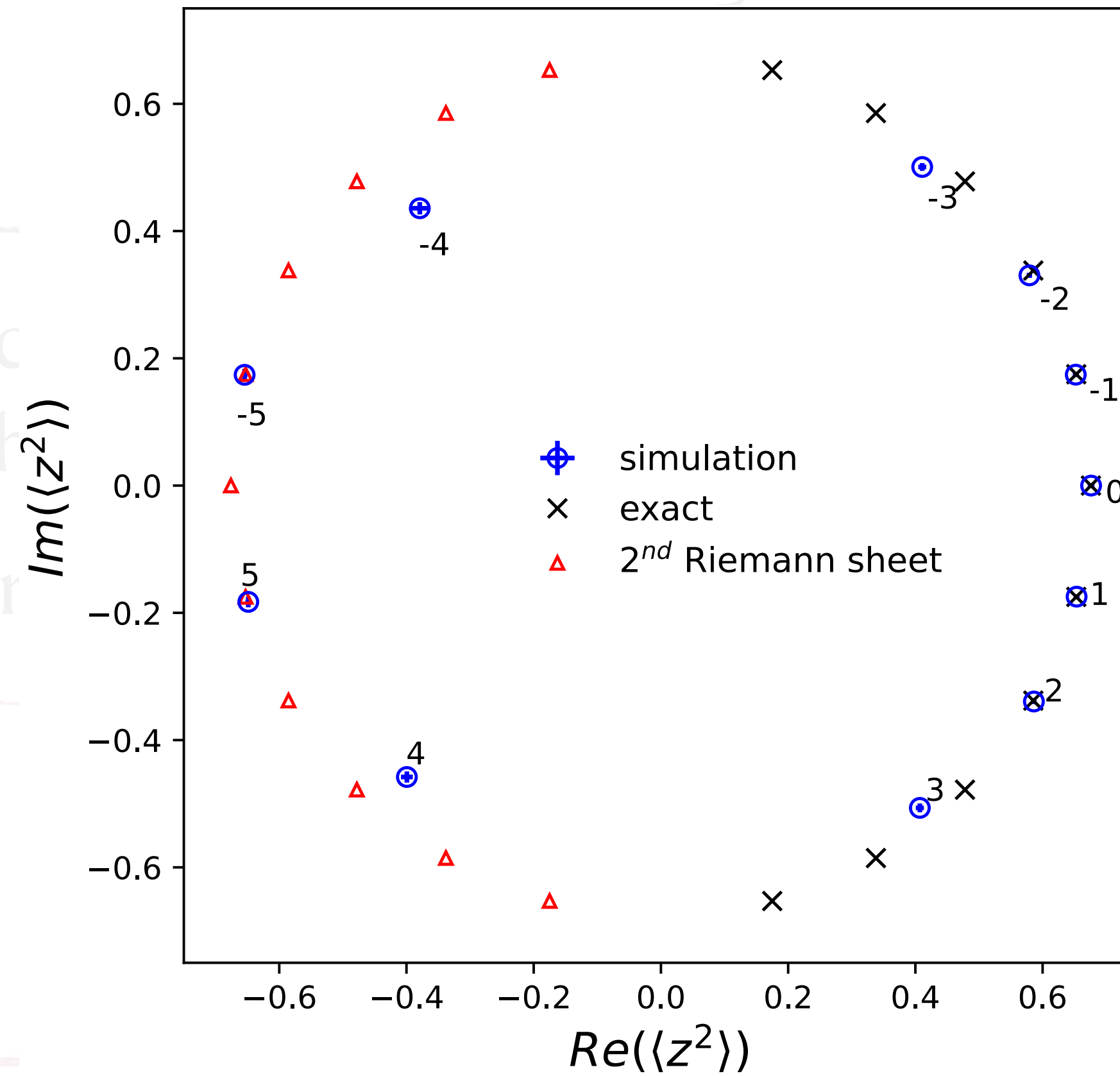
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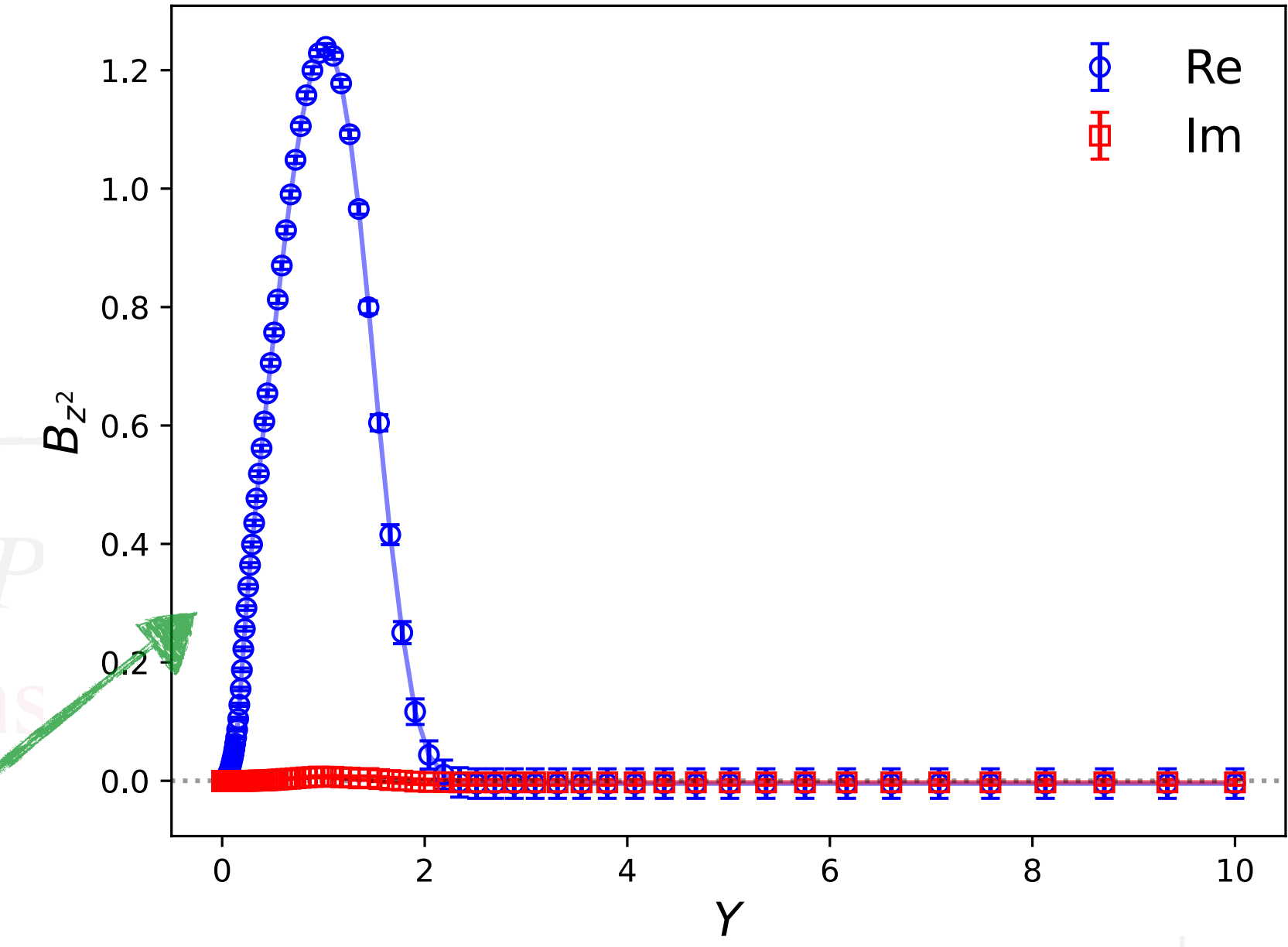
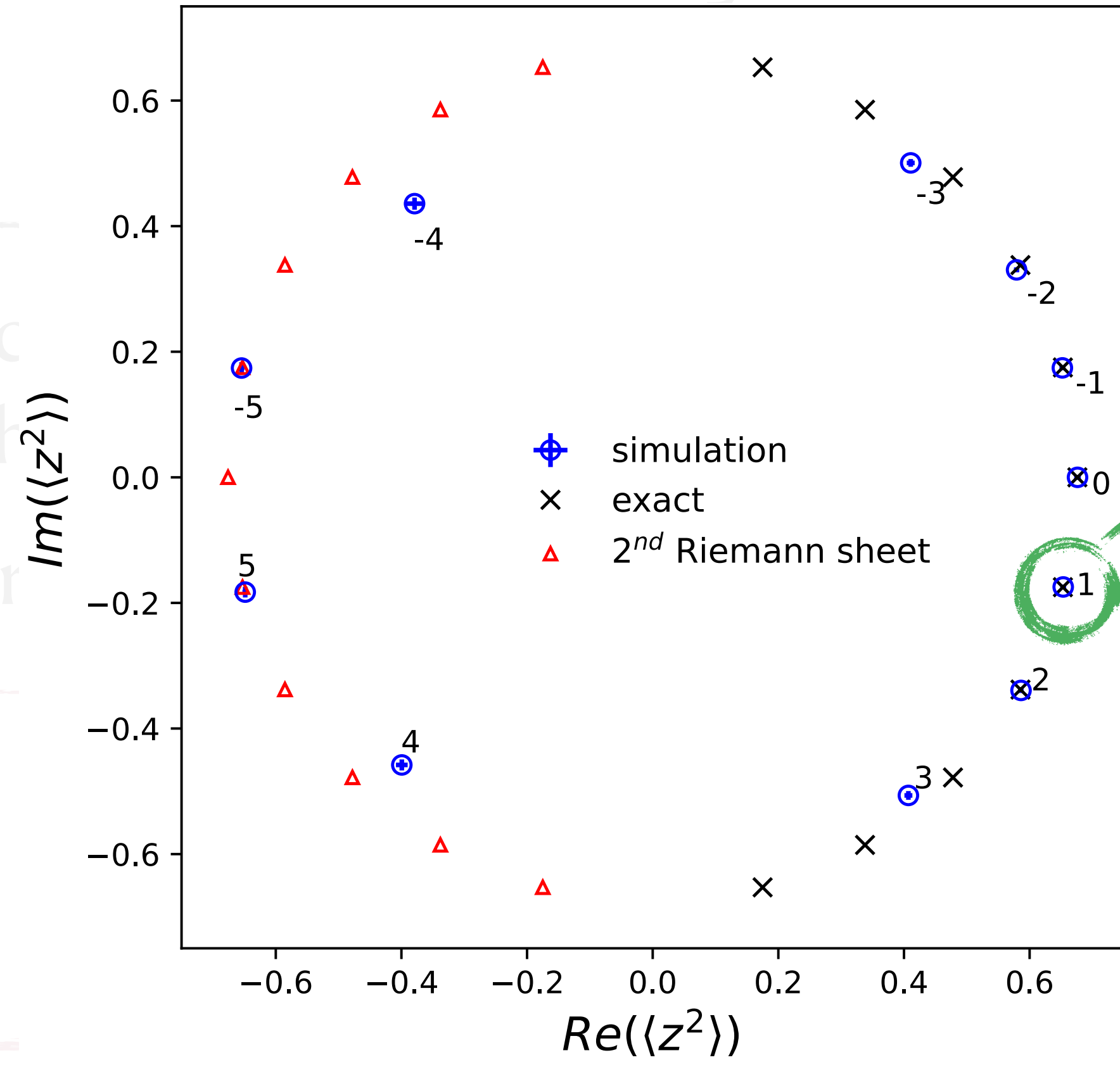
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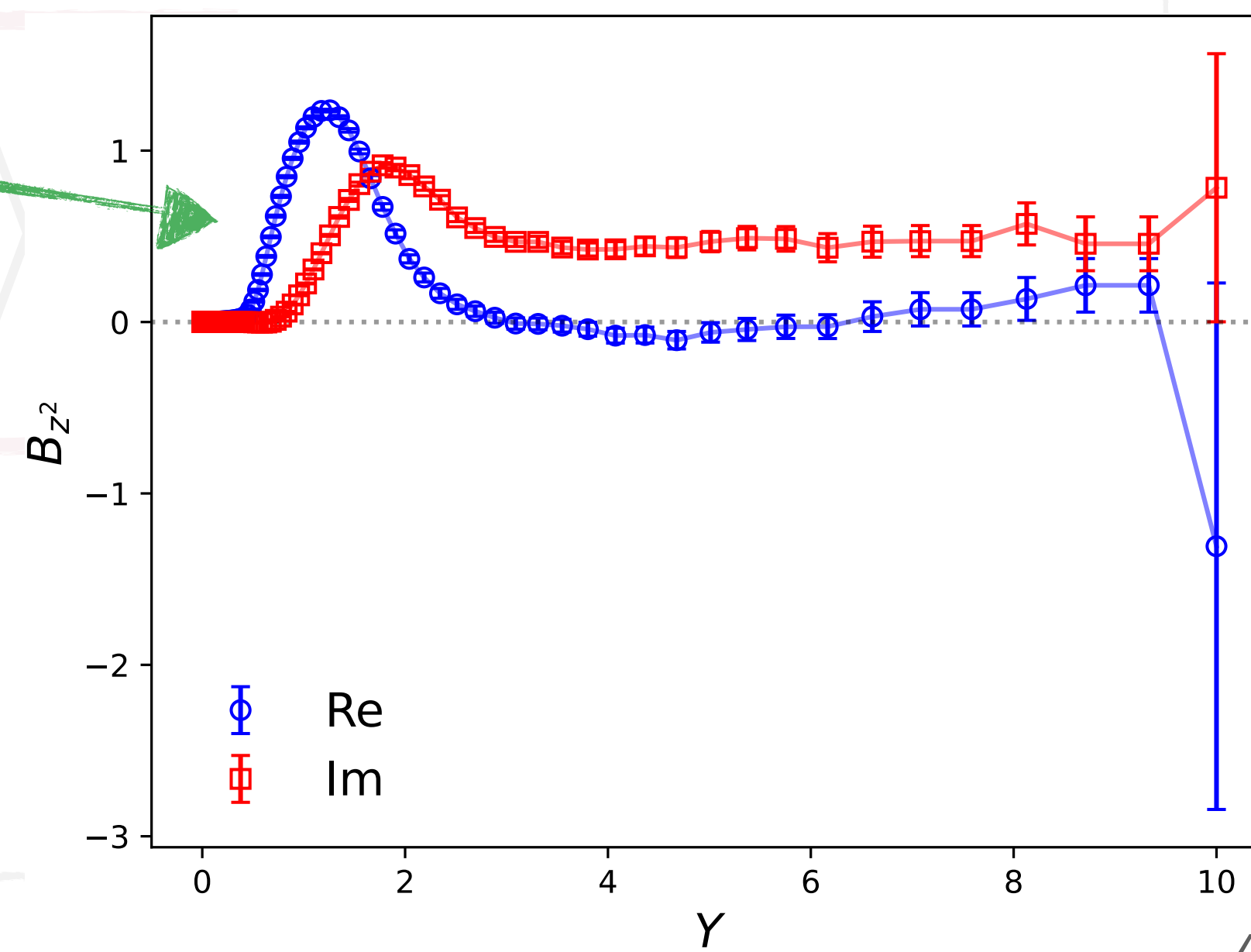
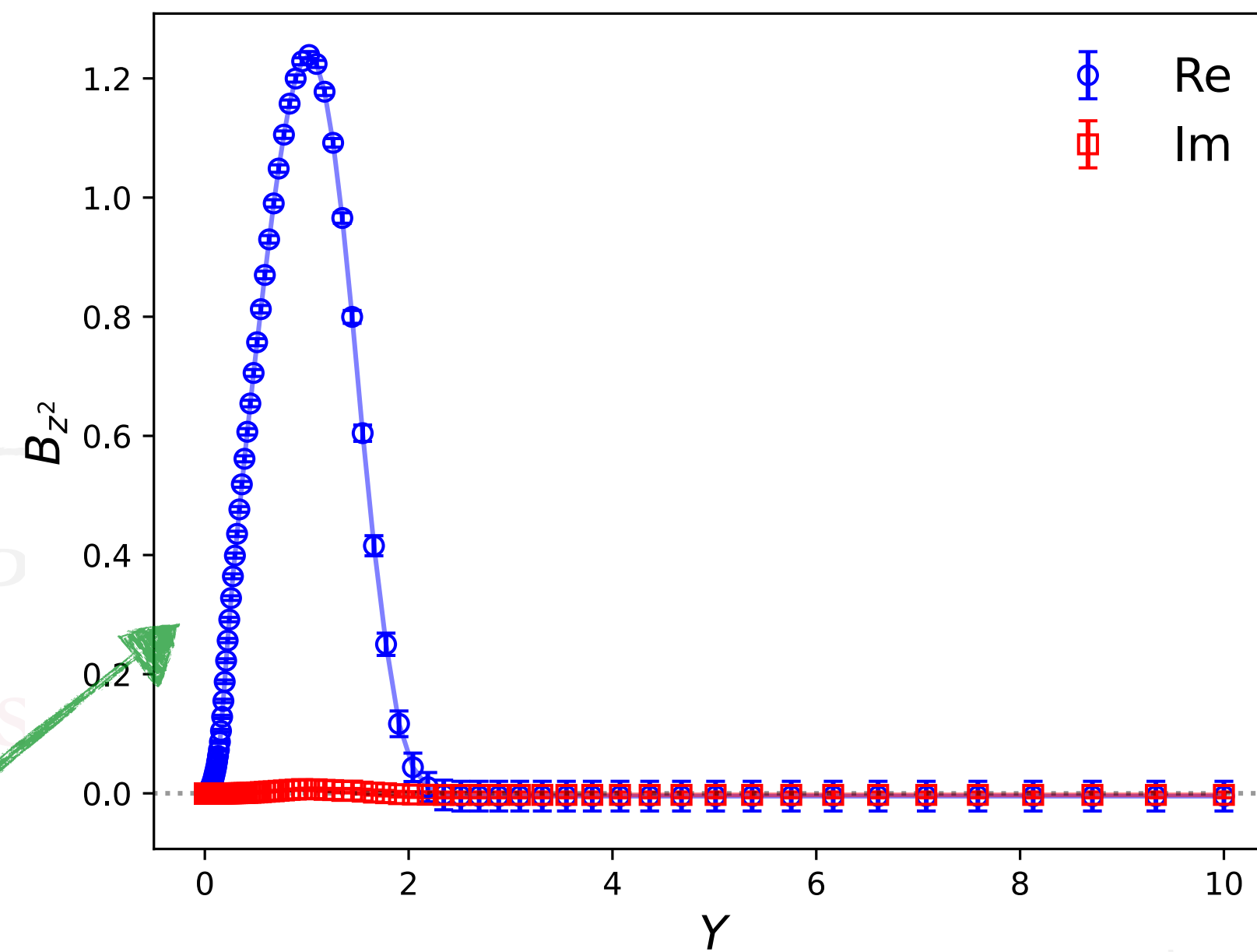
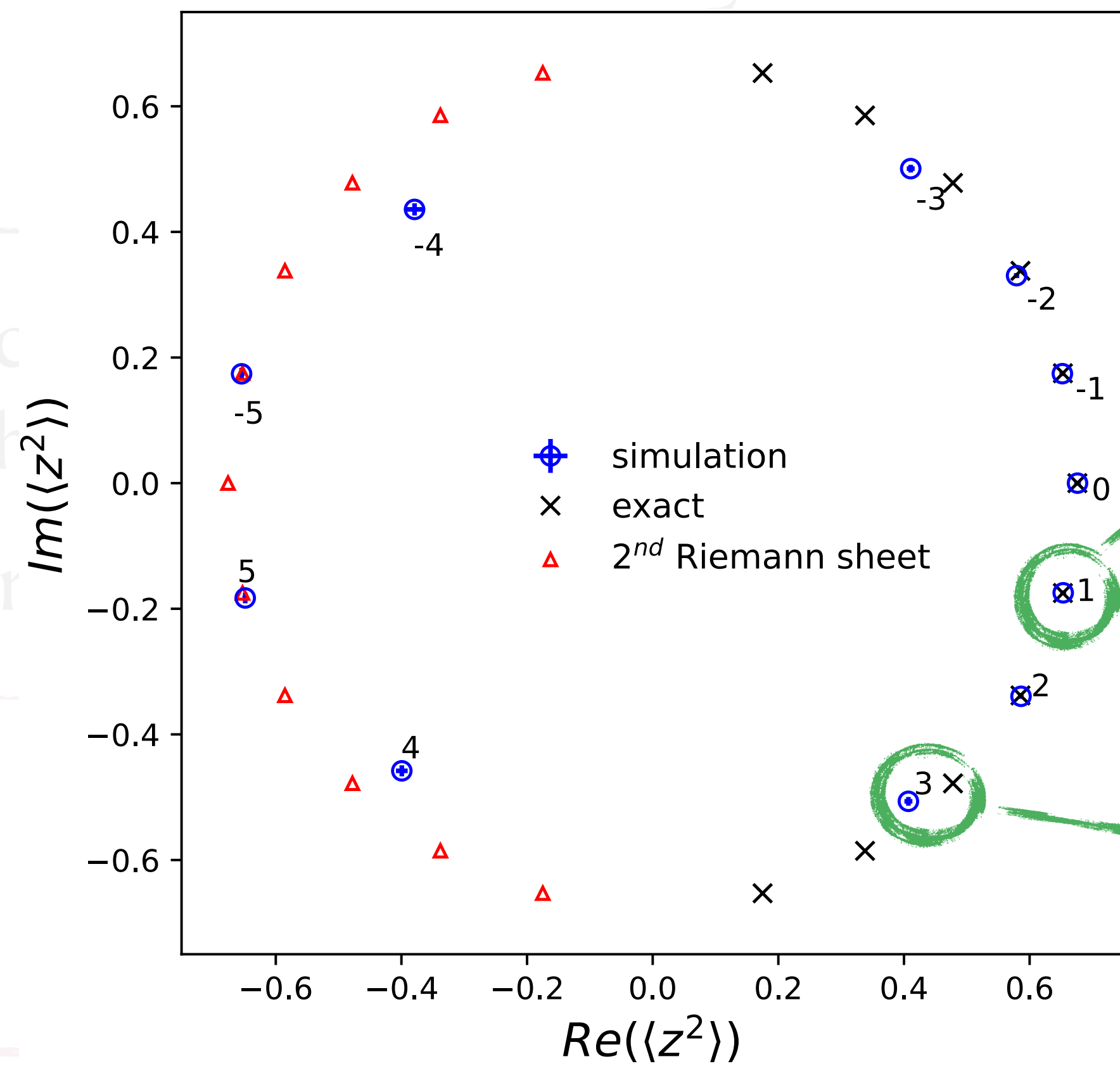
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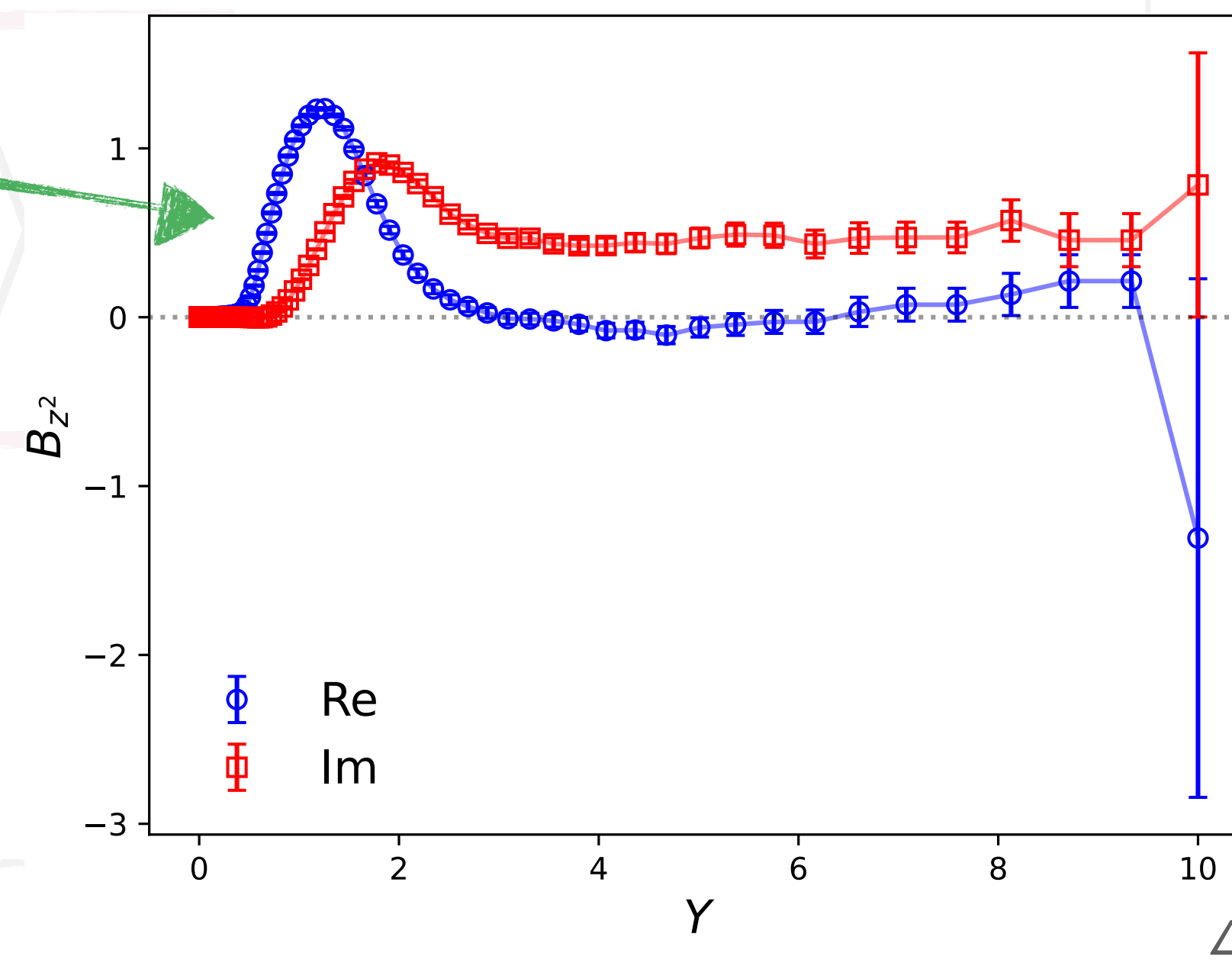
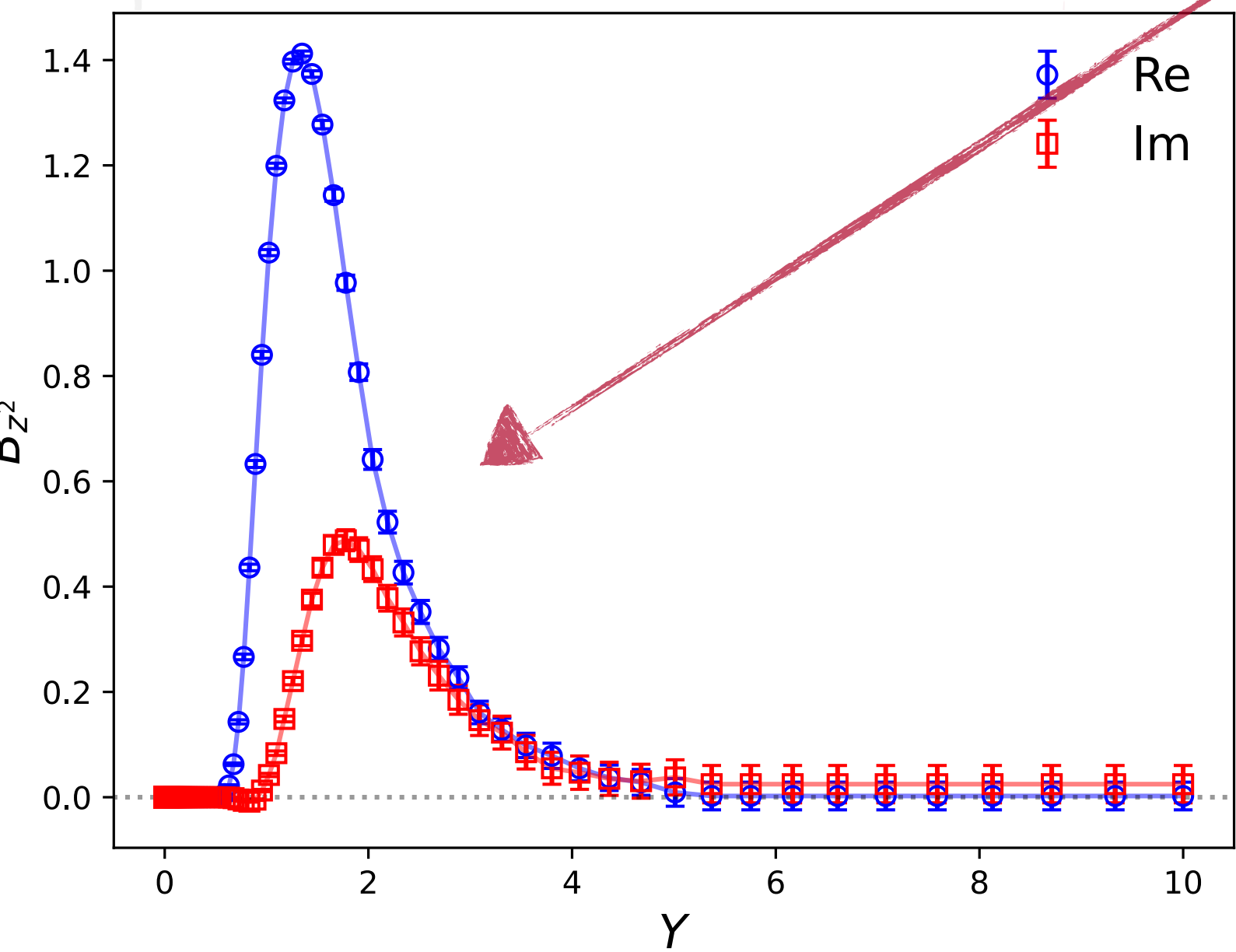
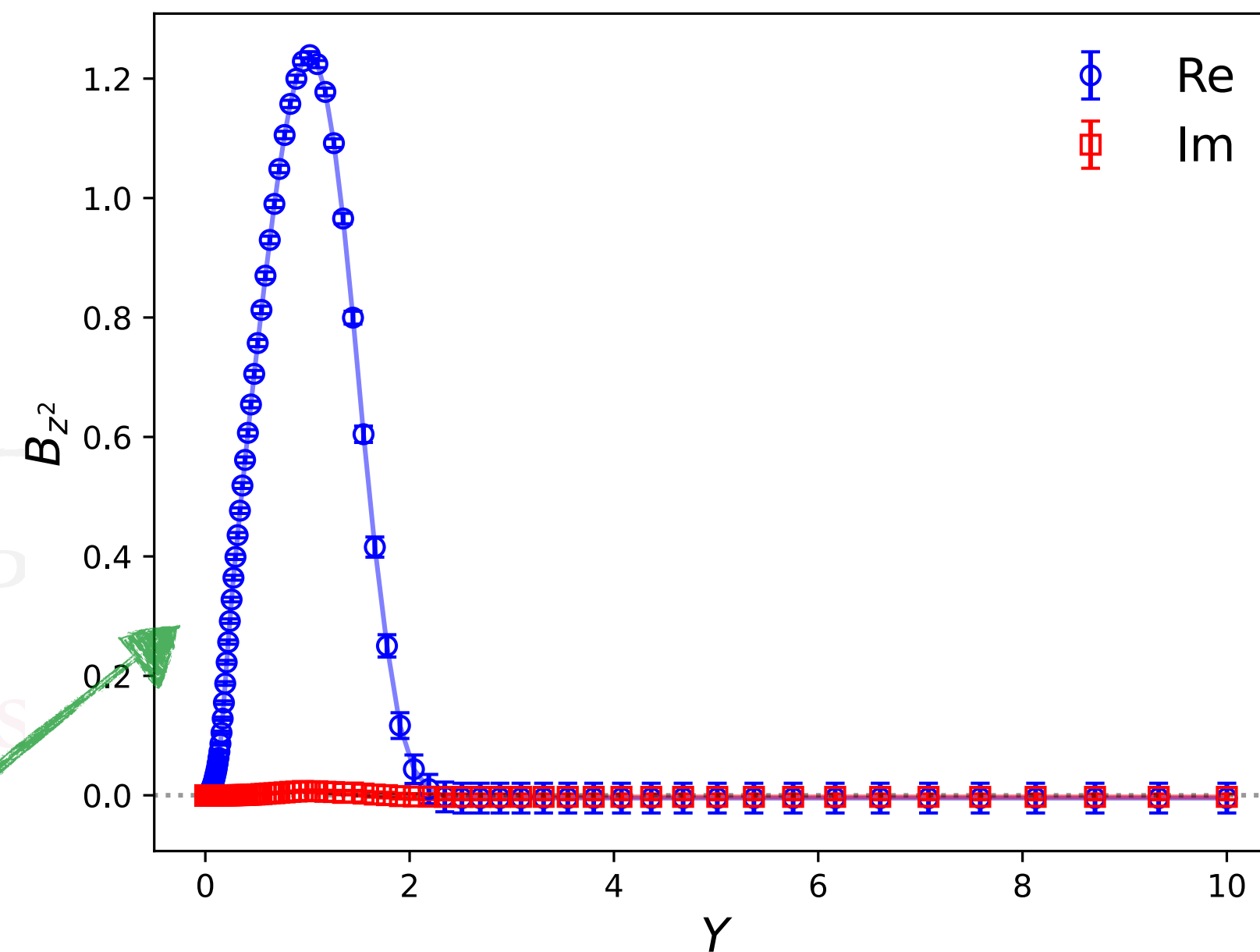
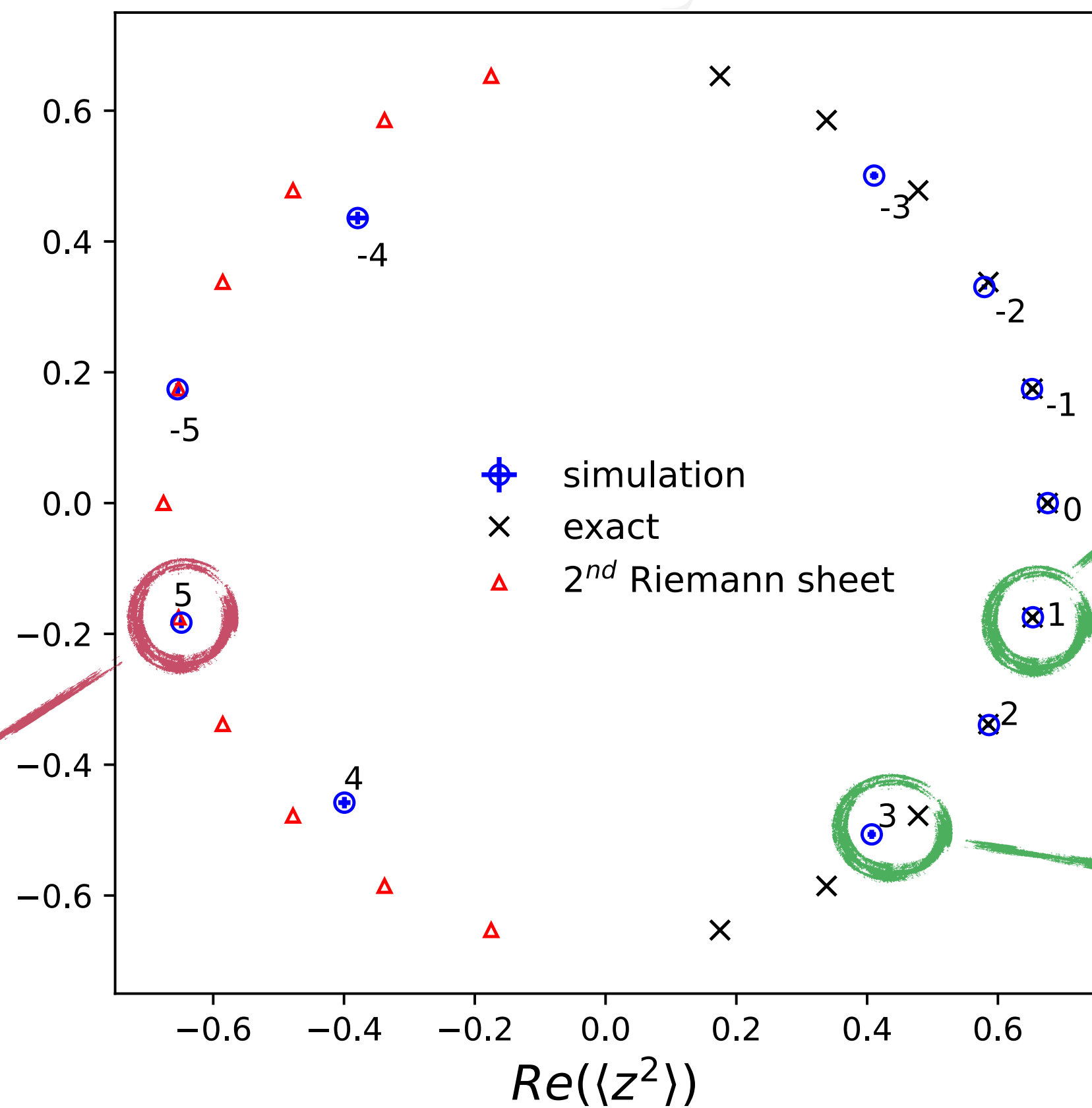
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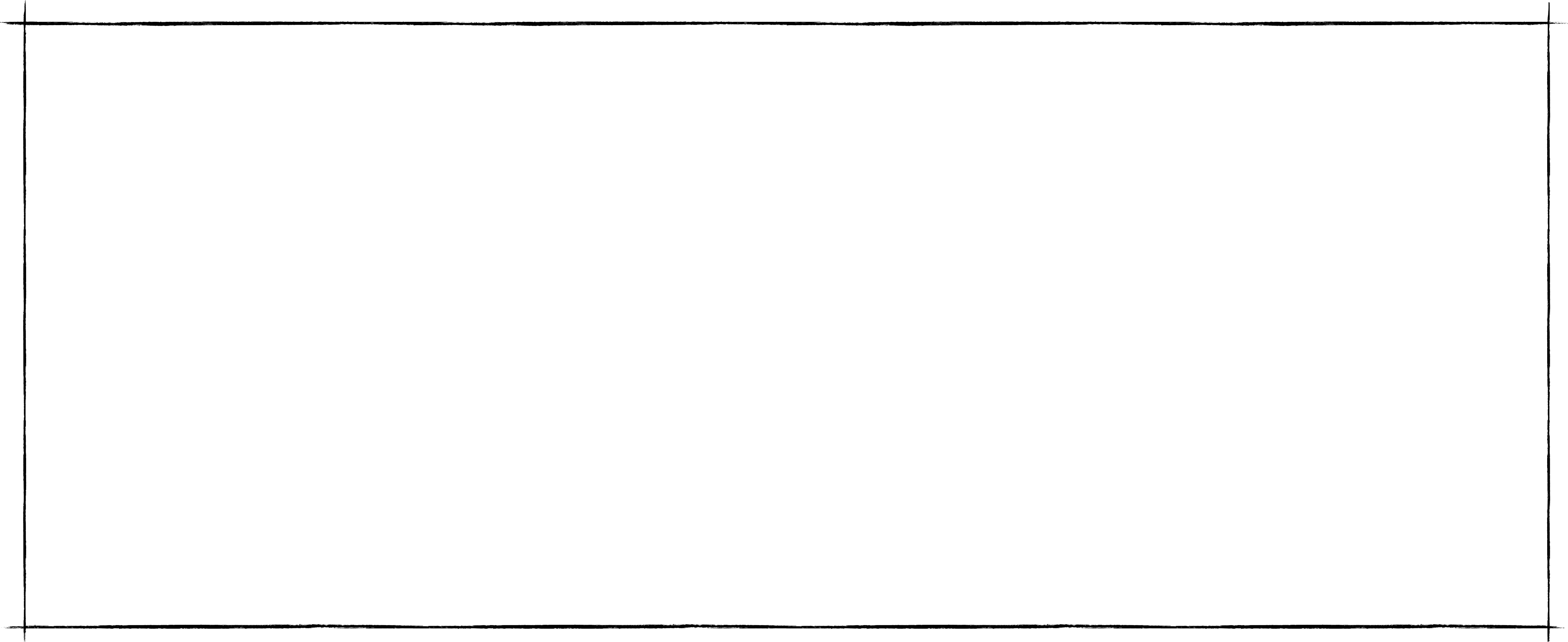
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- Cannot infer **correct solutions** from **vanishing boundary terms**.

# Integration cycles



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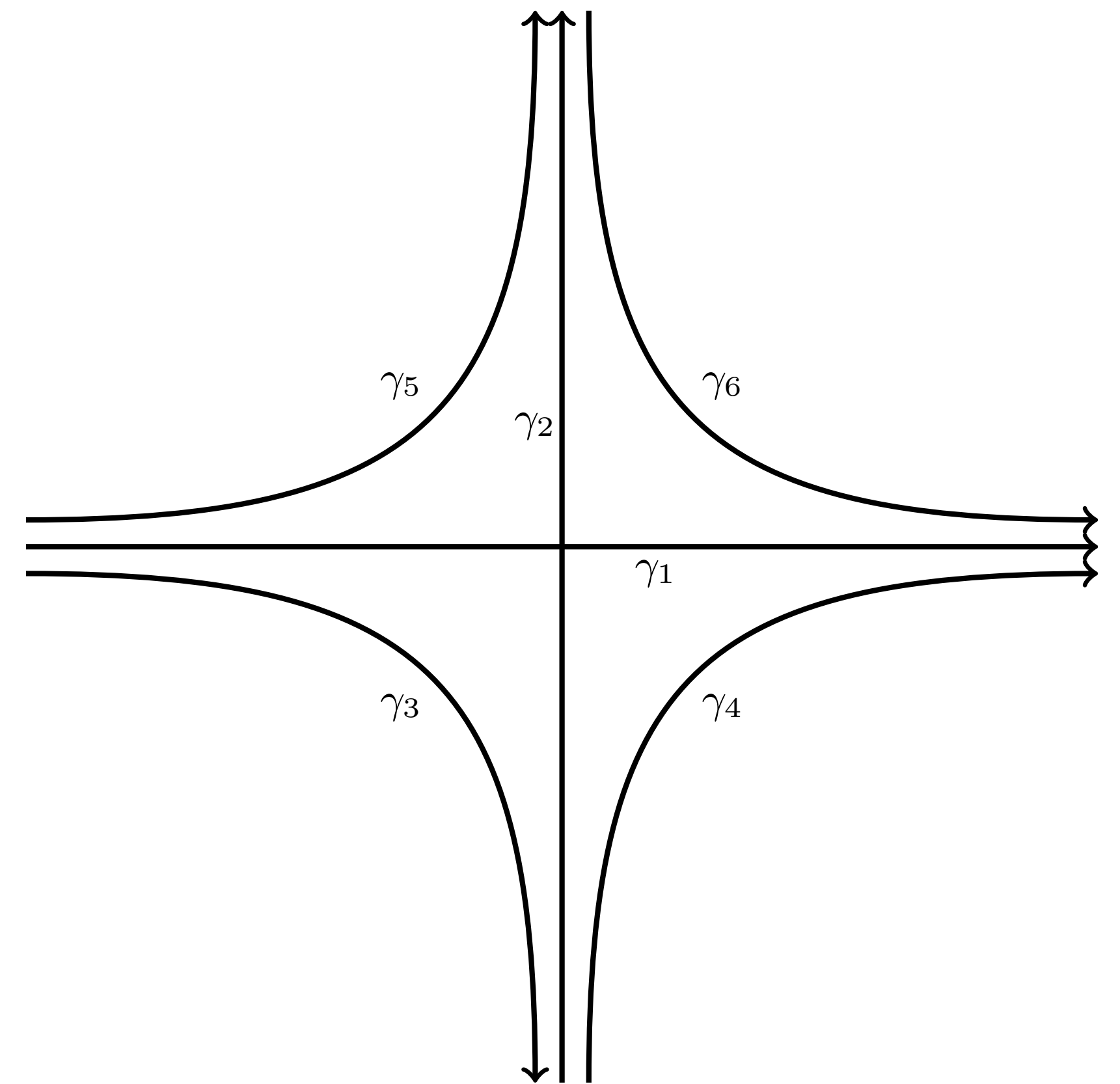
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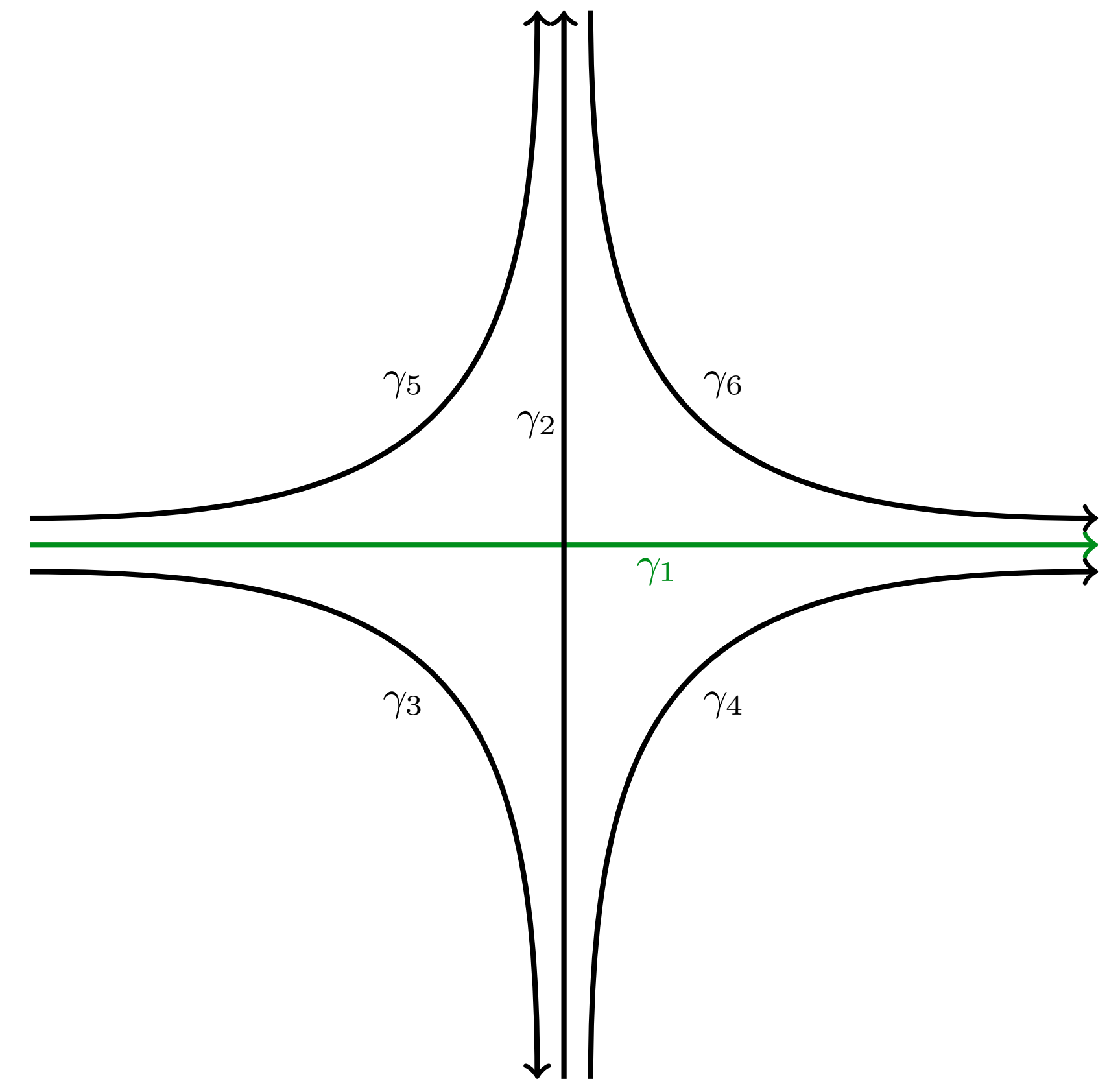




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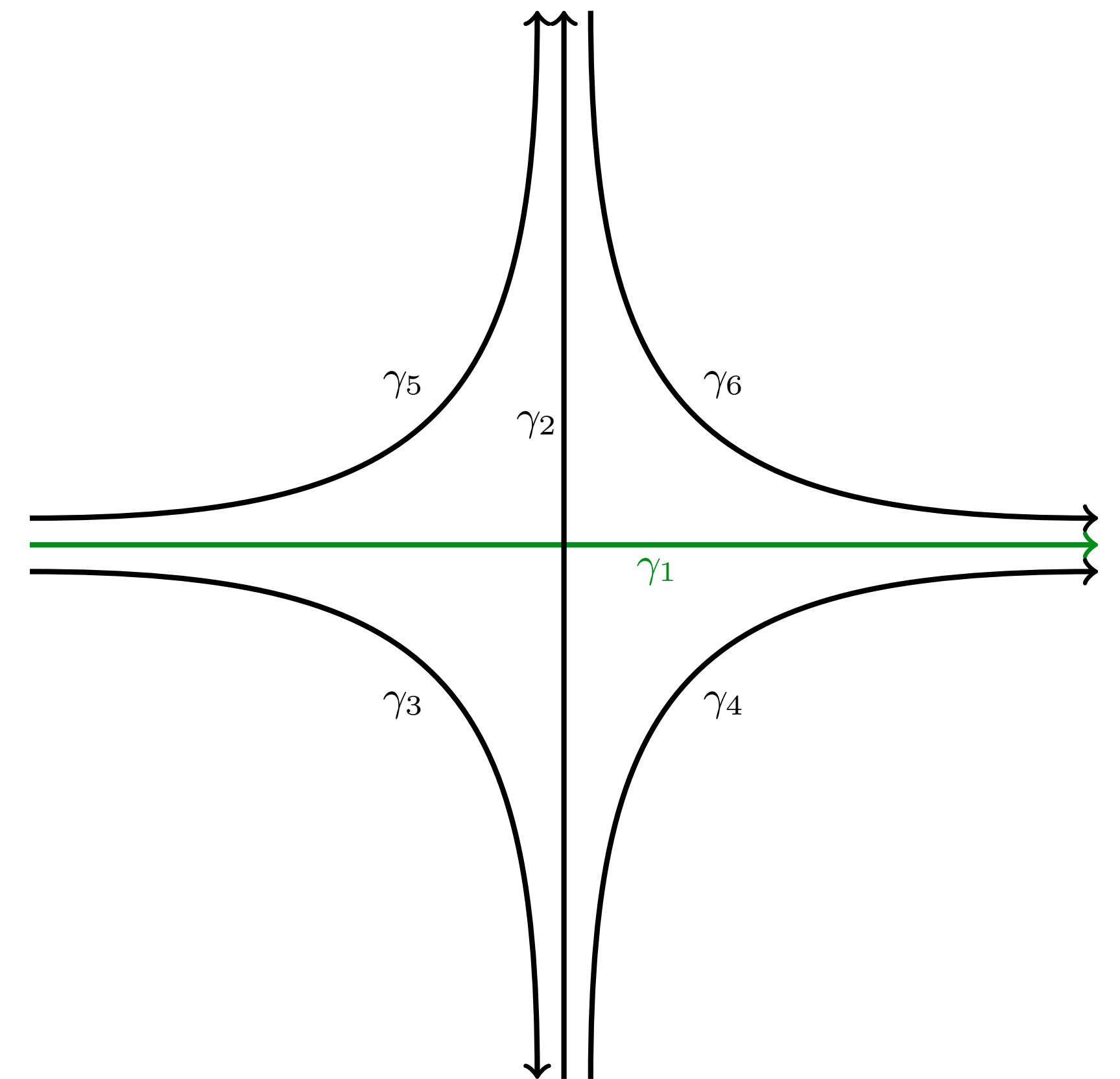
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- **Vanishing boundary terms** only imply that result is **linear combination** of integration cycles:

$$\langle \mathcal{O} \rangle_{\text{CL}} = \sum_{i=1}^3 a_i \langle \mathcal{O} \rangle_{\gamma_i}$$

Salcedo, Seiler '19



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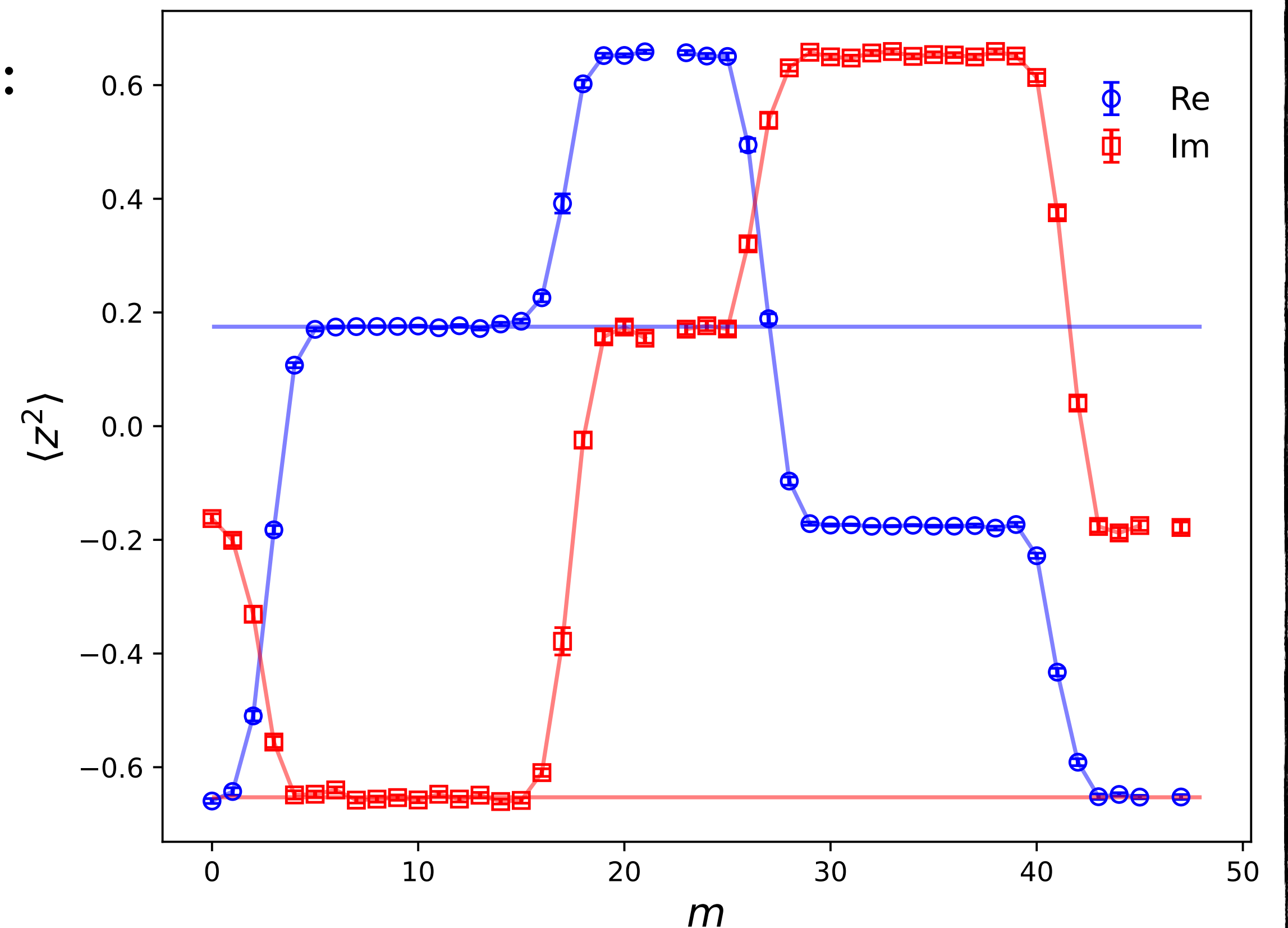
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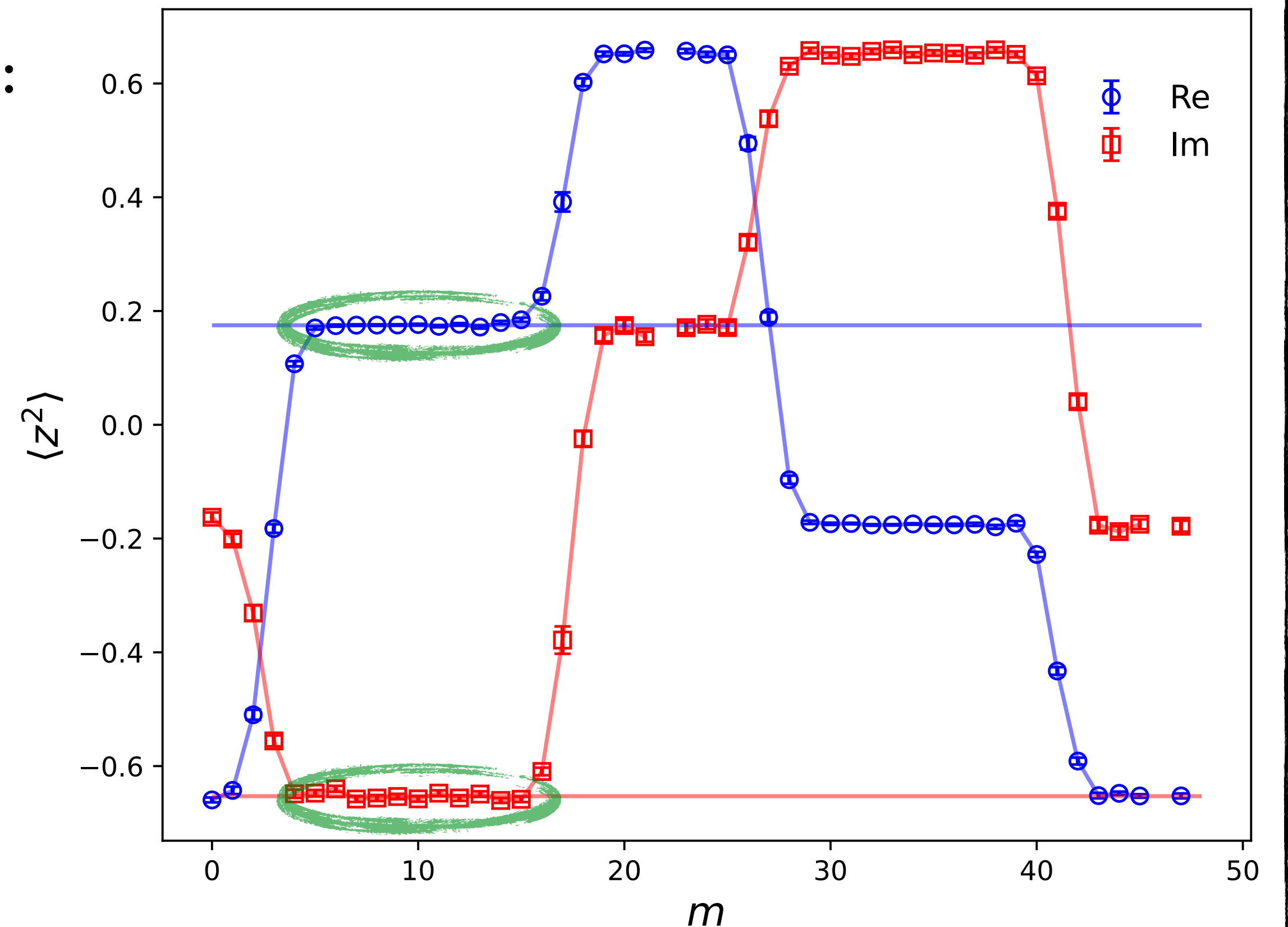


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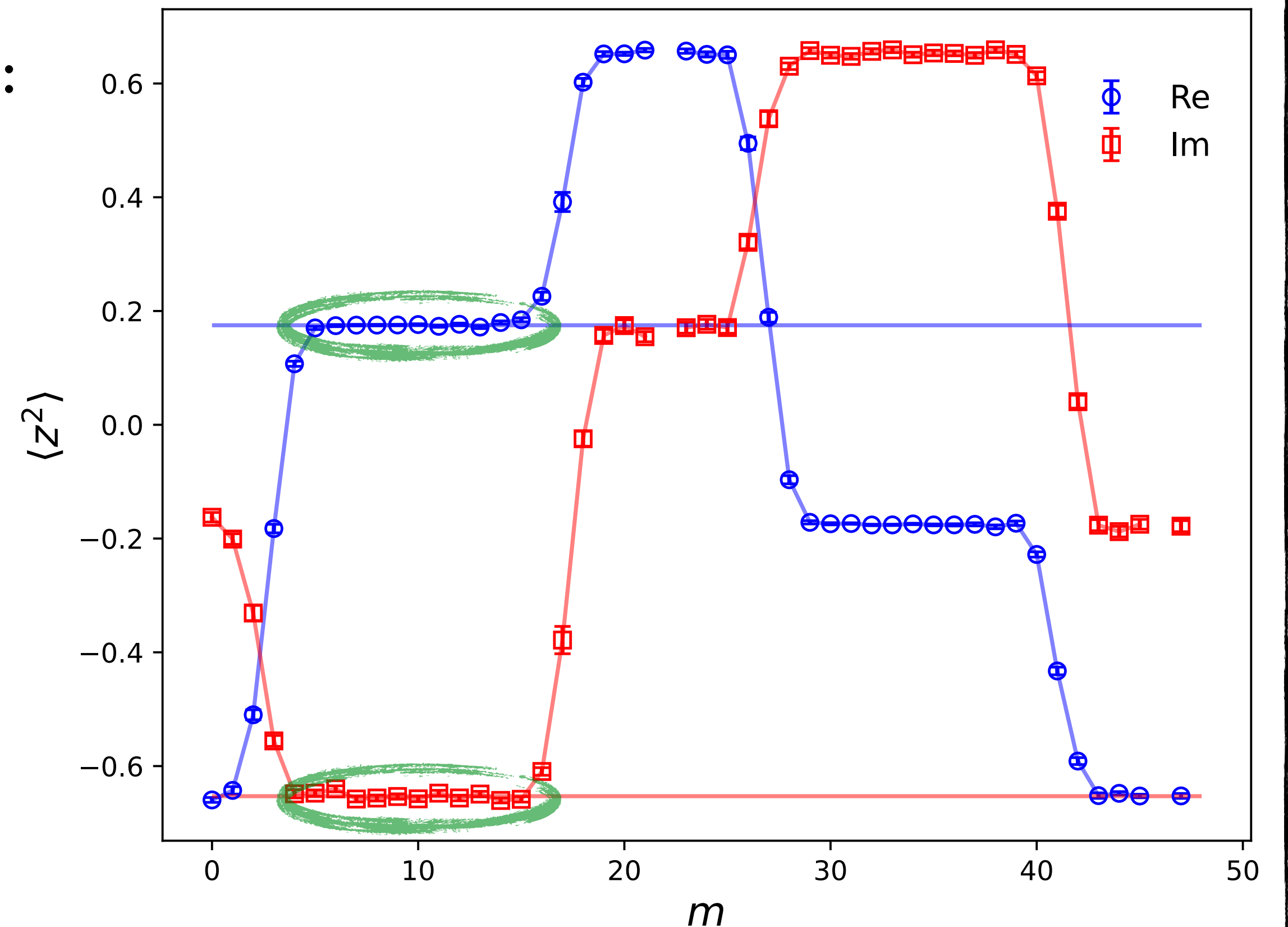


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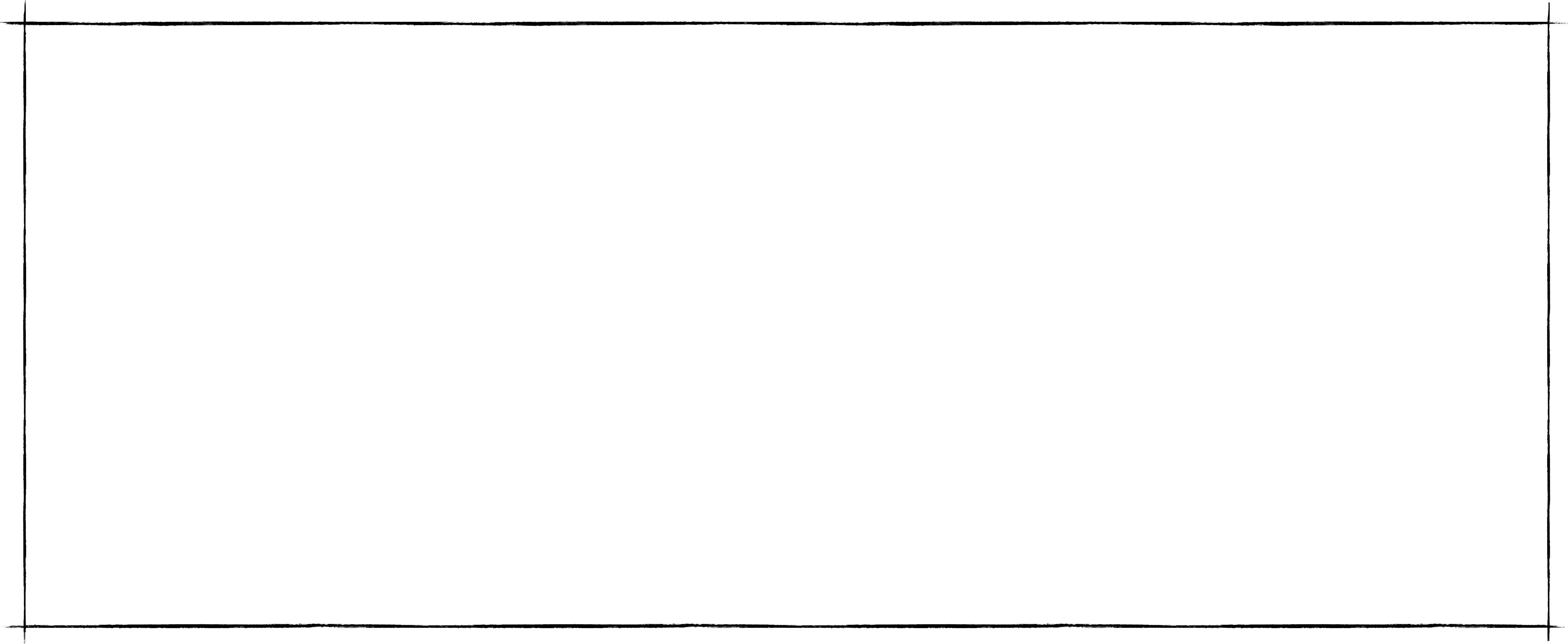
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- **Kernel can restore correct convergence.**  
Okamoto et al. '89



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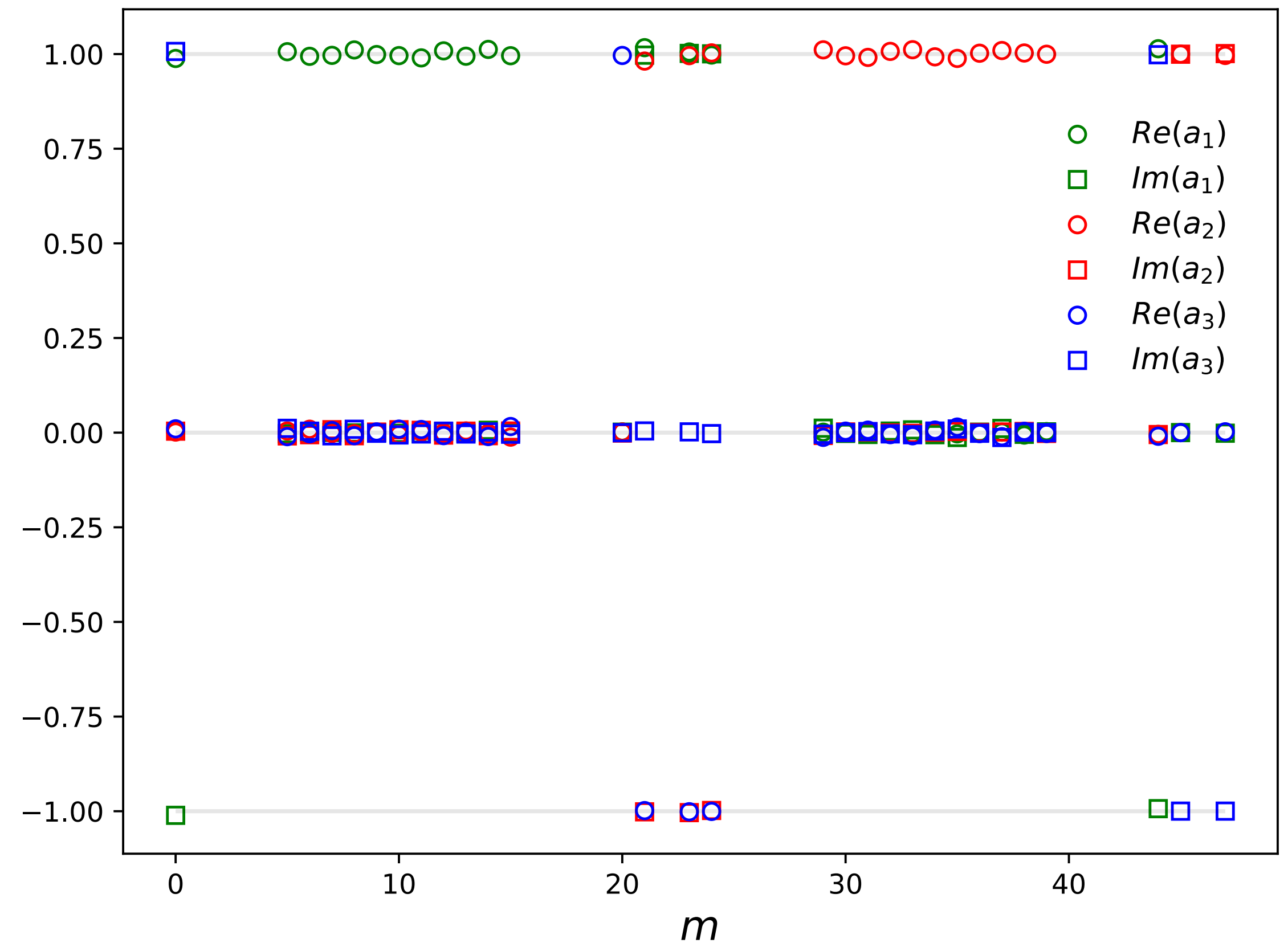
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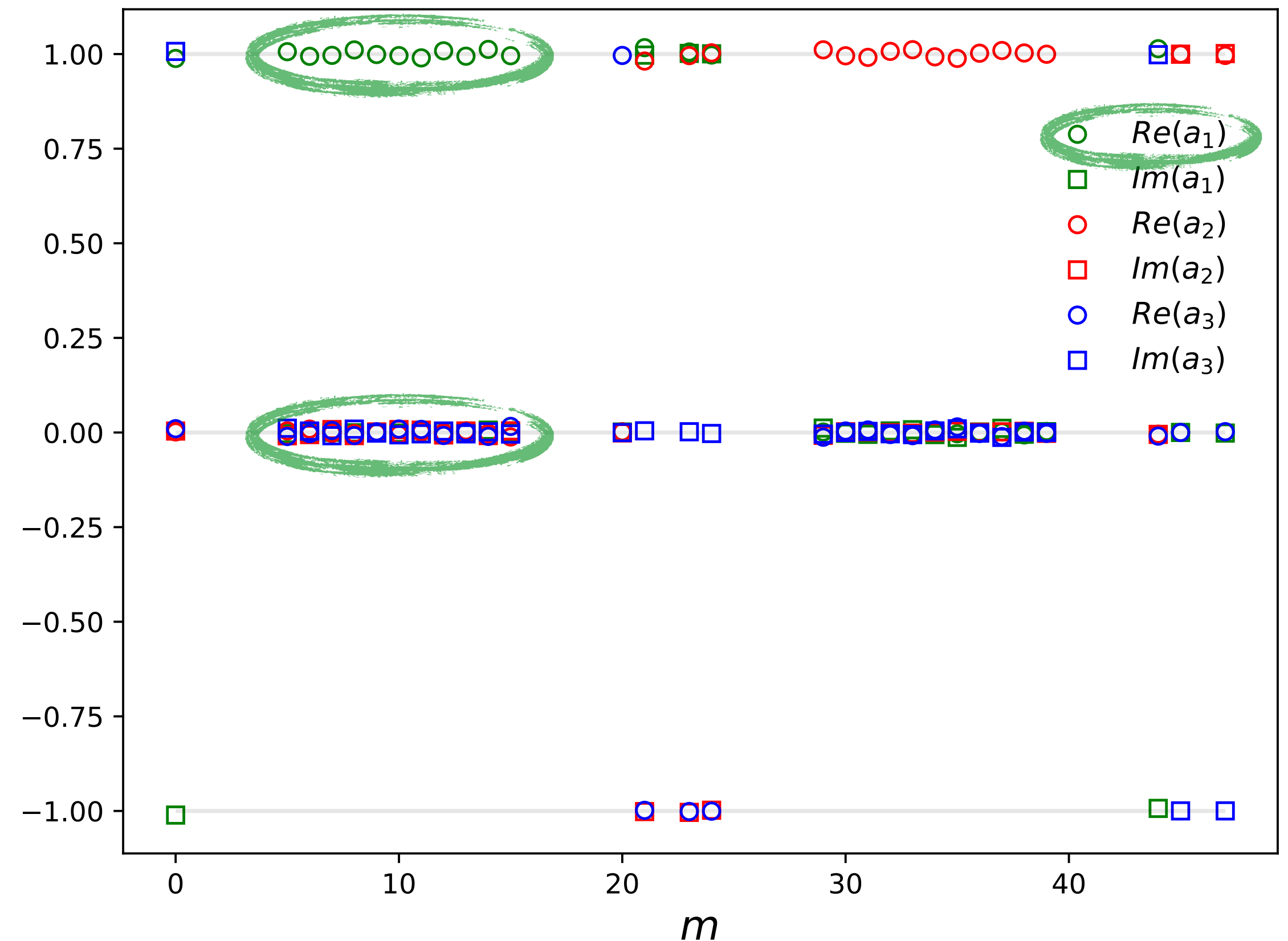


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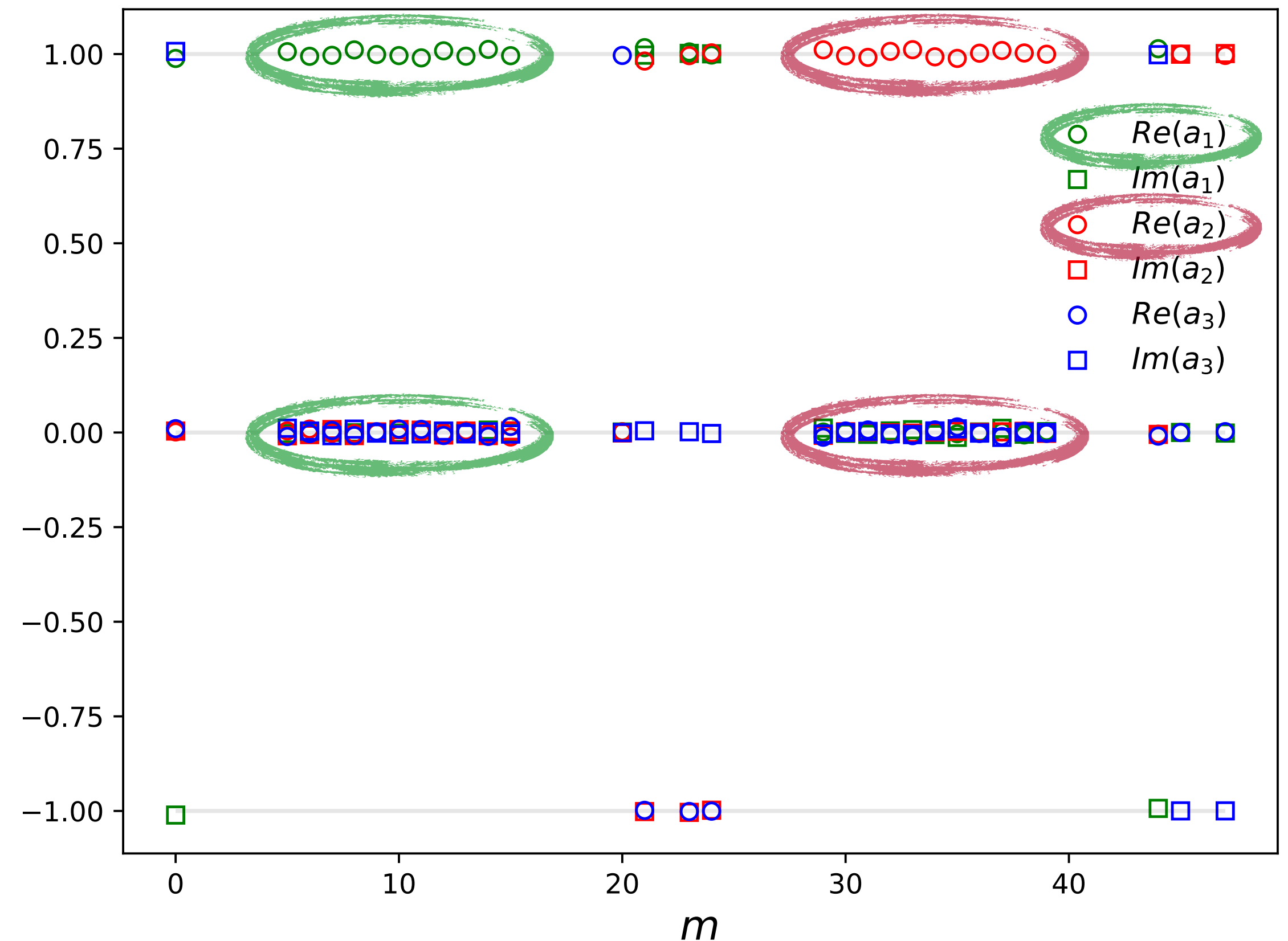


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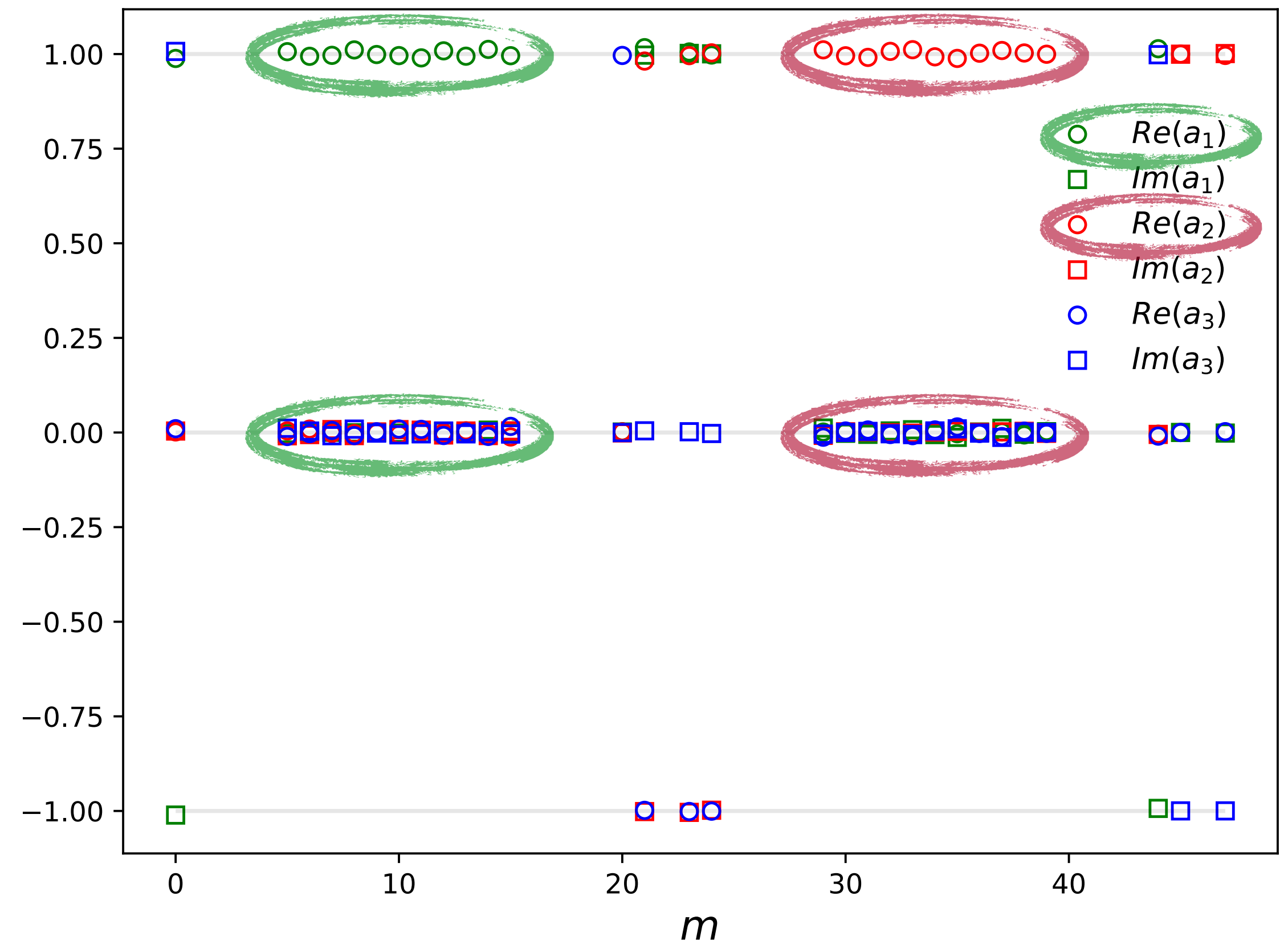


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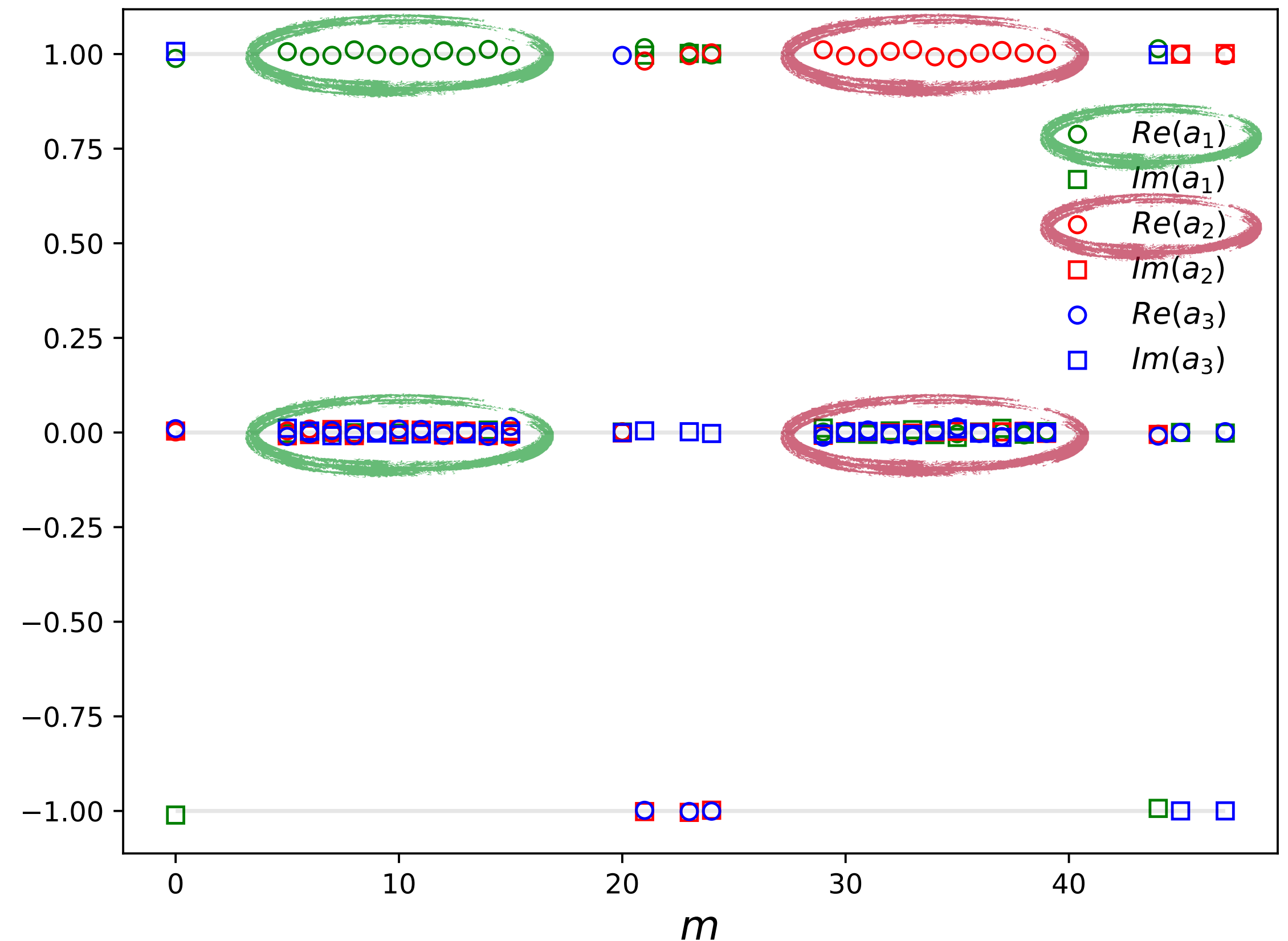


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- Only proven for a single degree of freedom.



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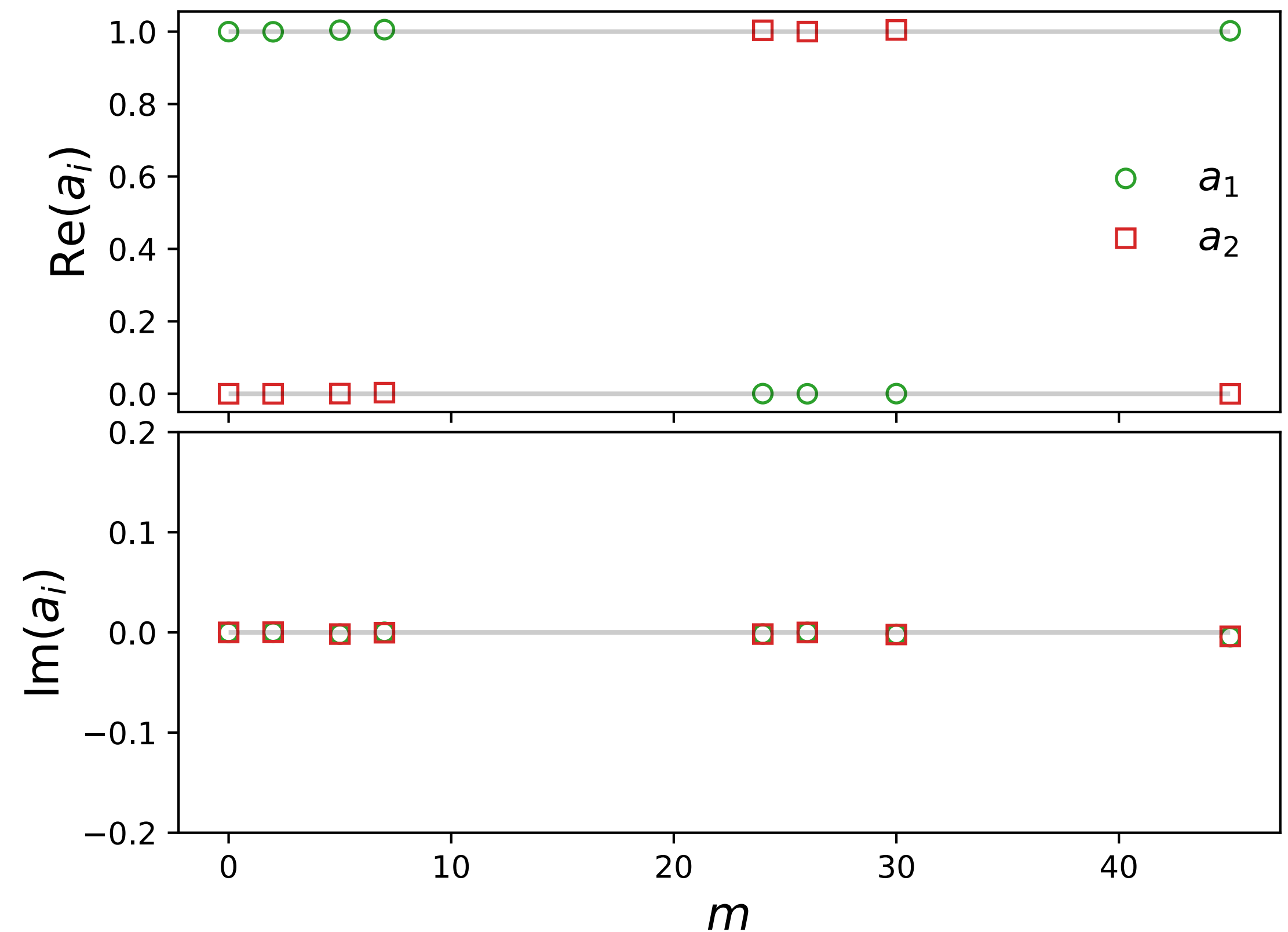
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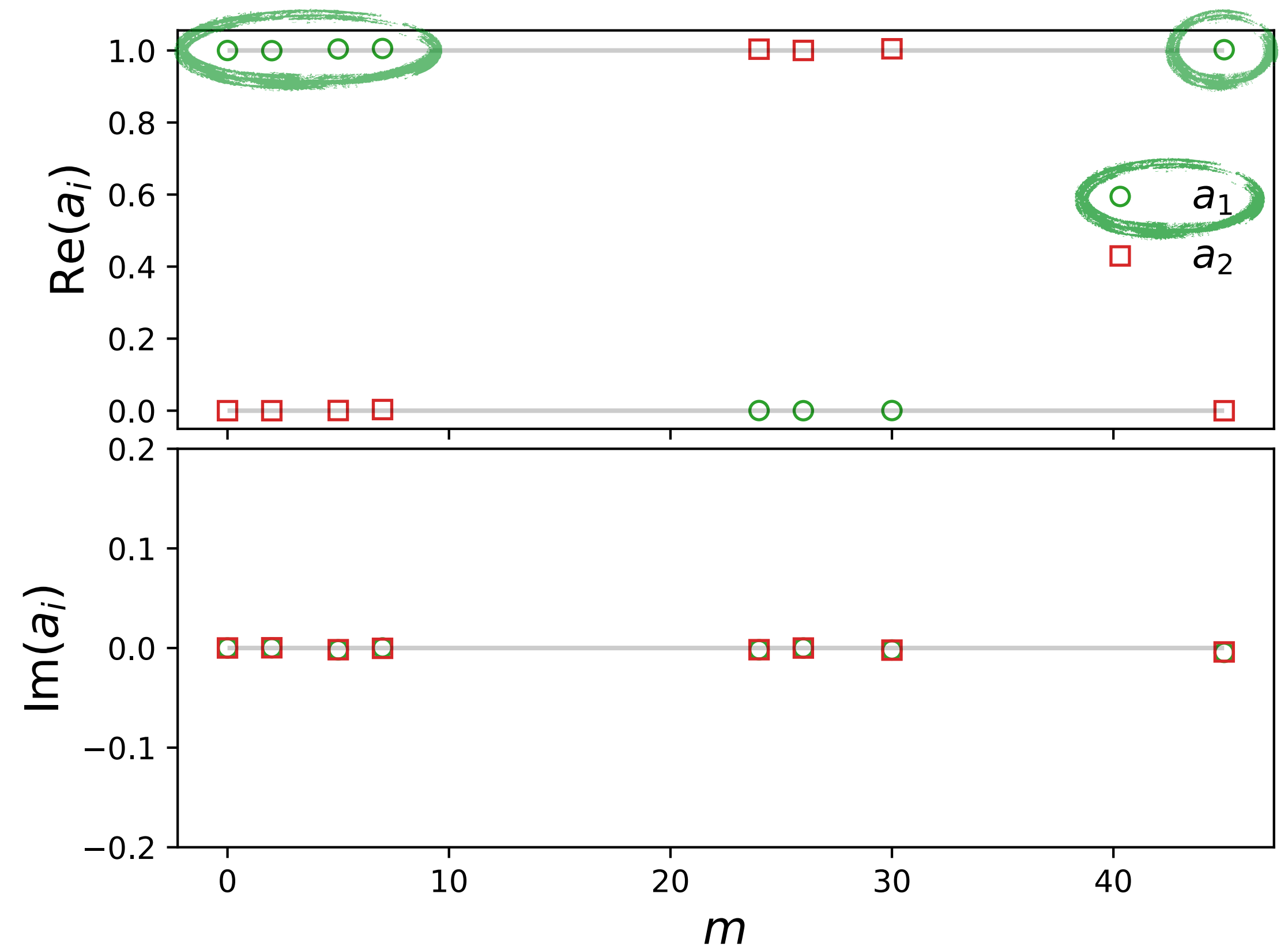
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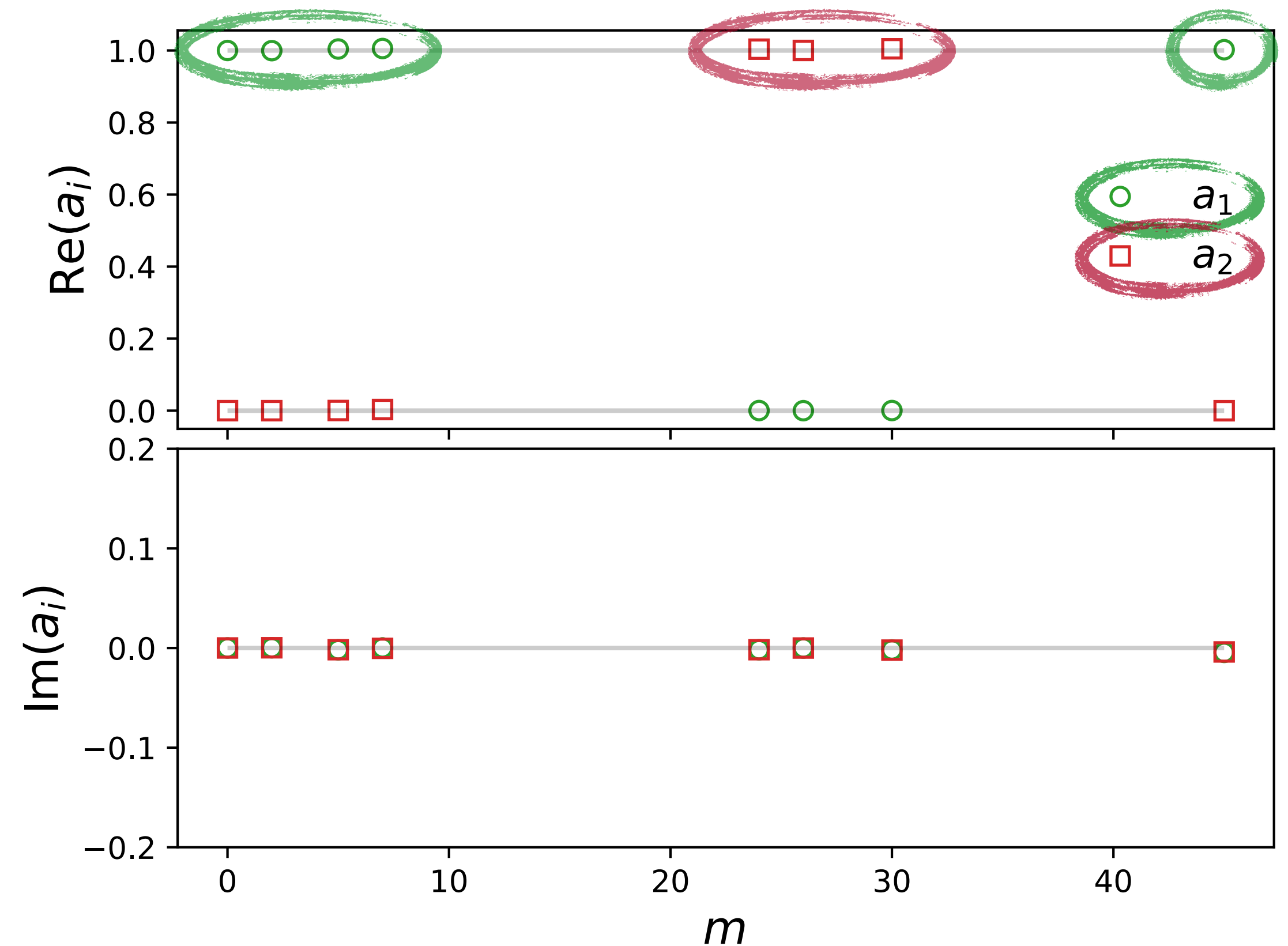
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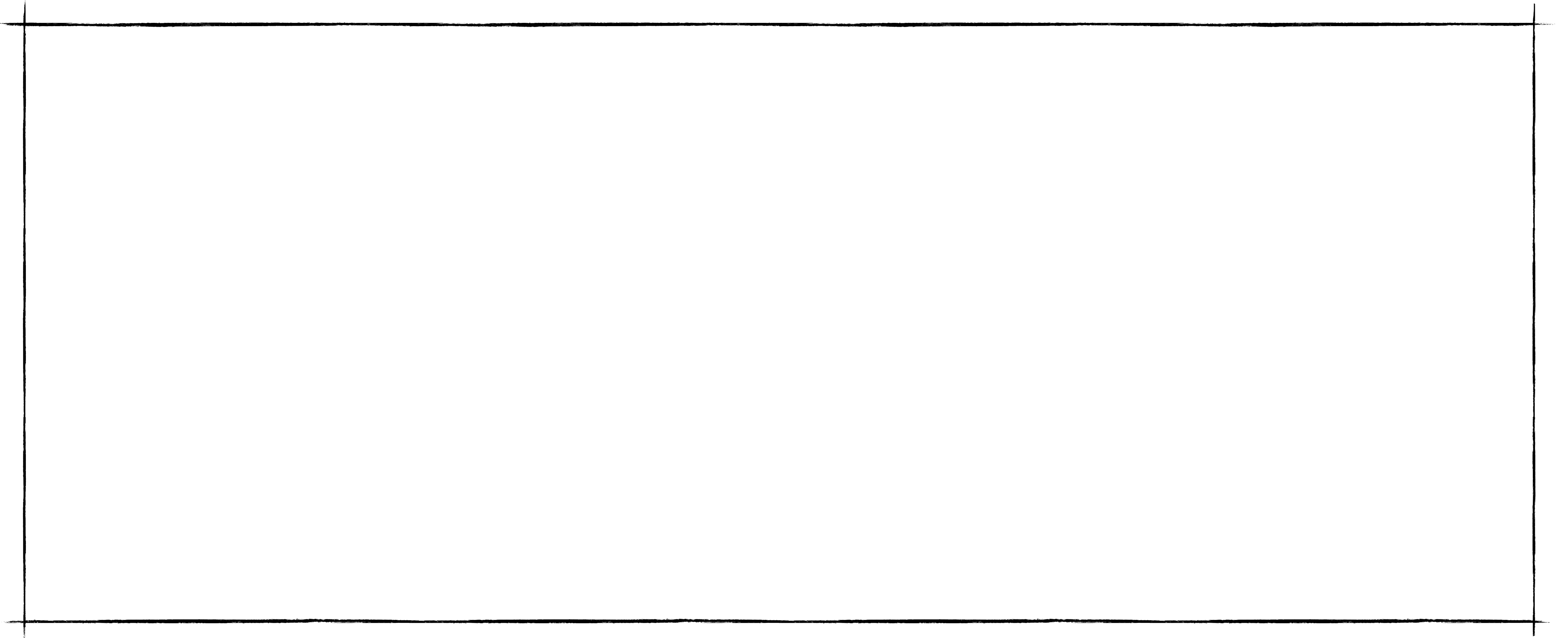
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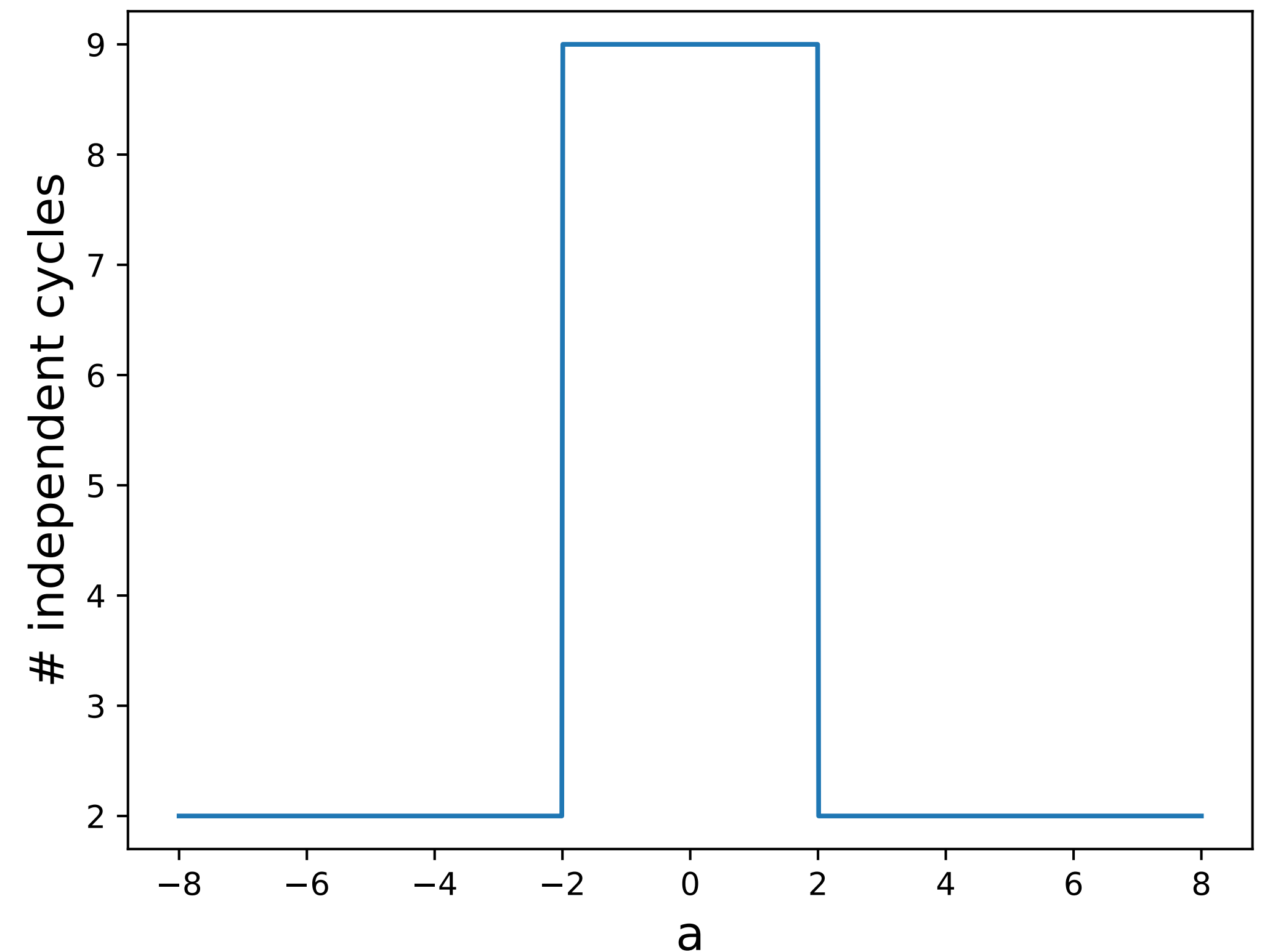
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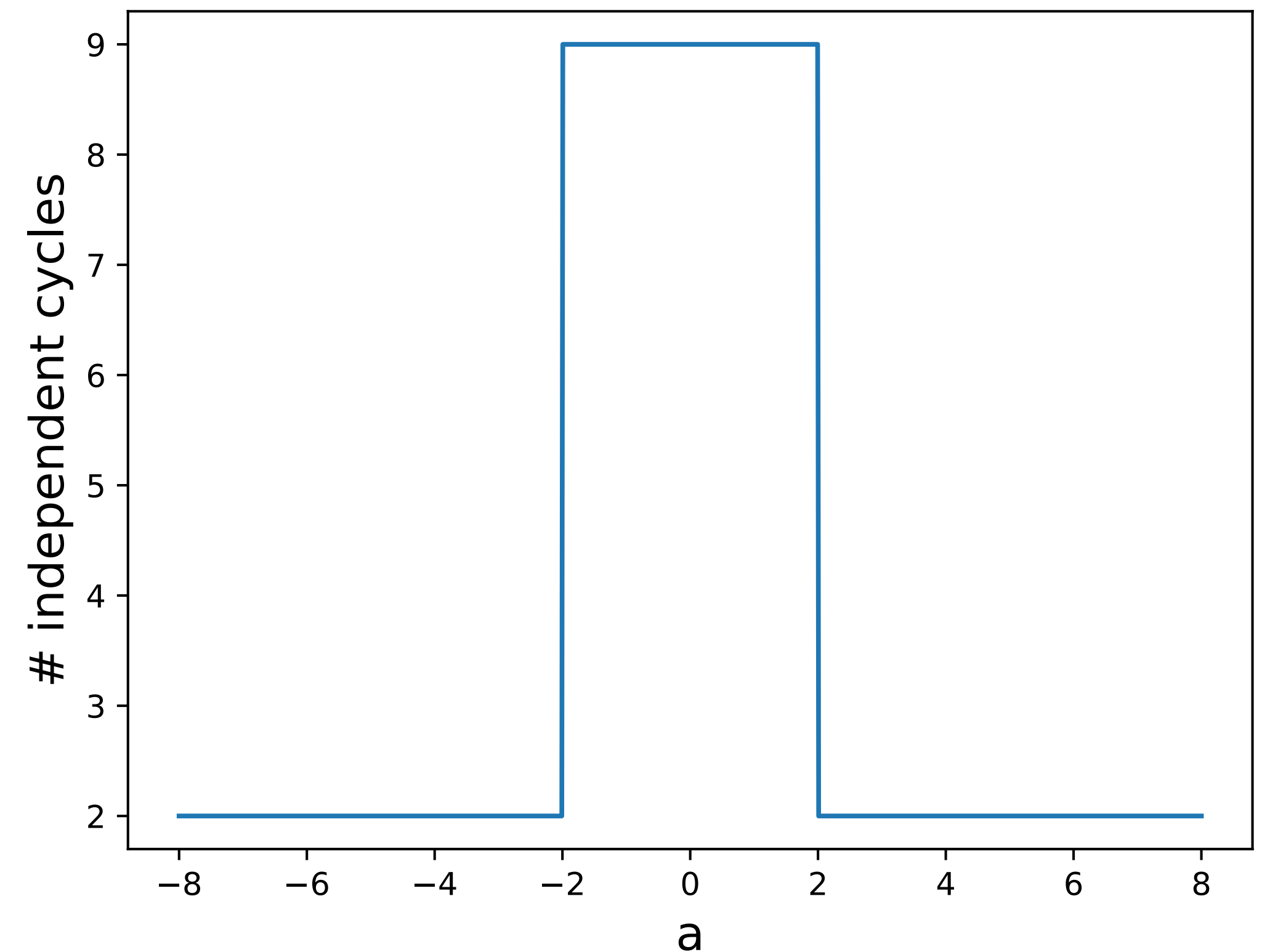


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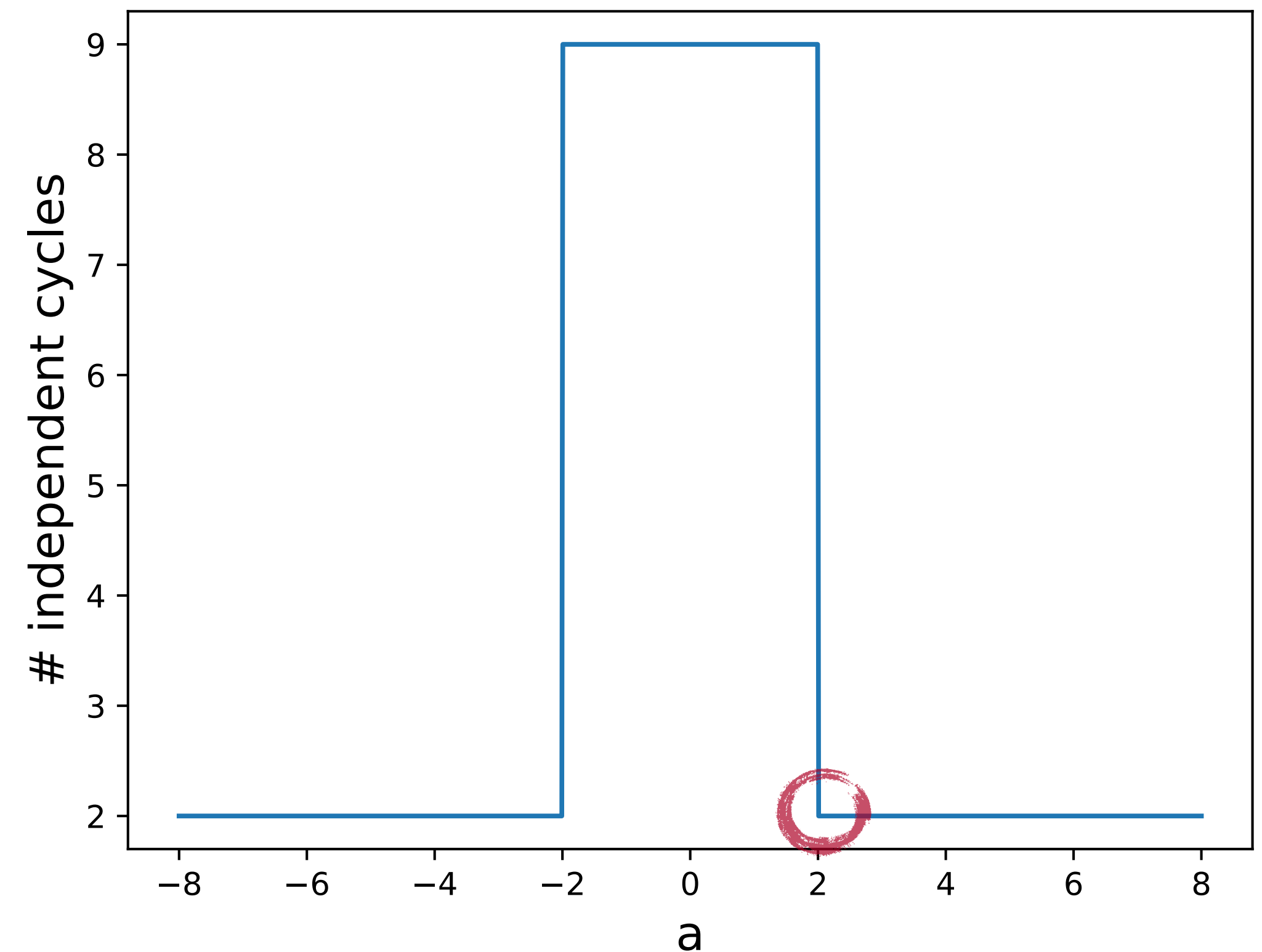


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- The  $O(2)$ -symmetric point  $a = 2$  is “critical”.



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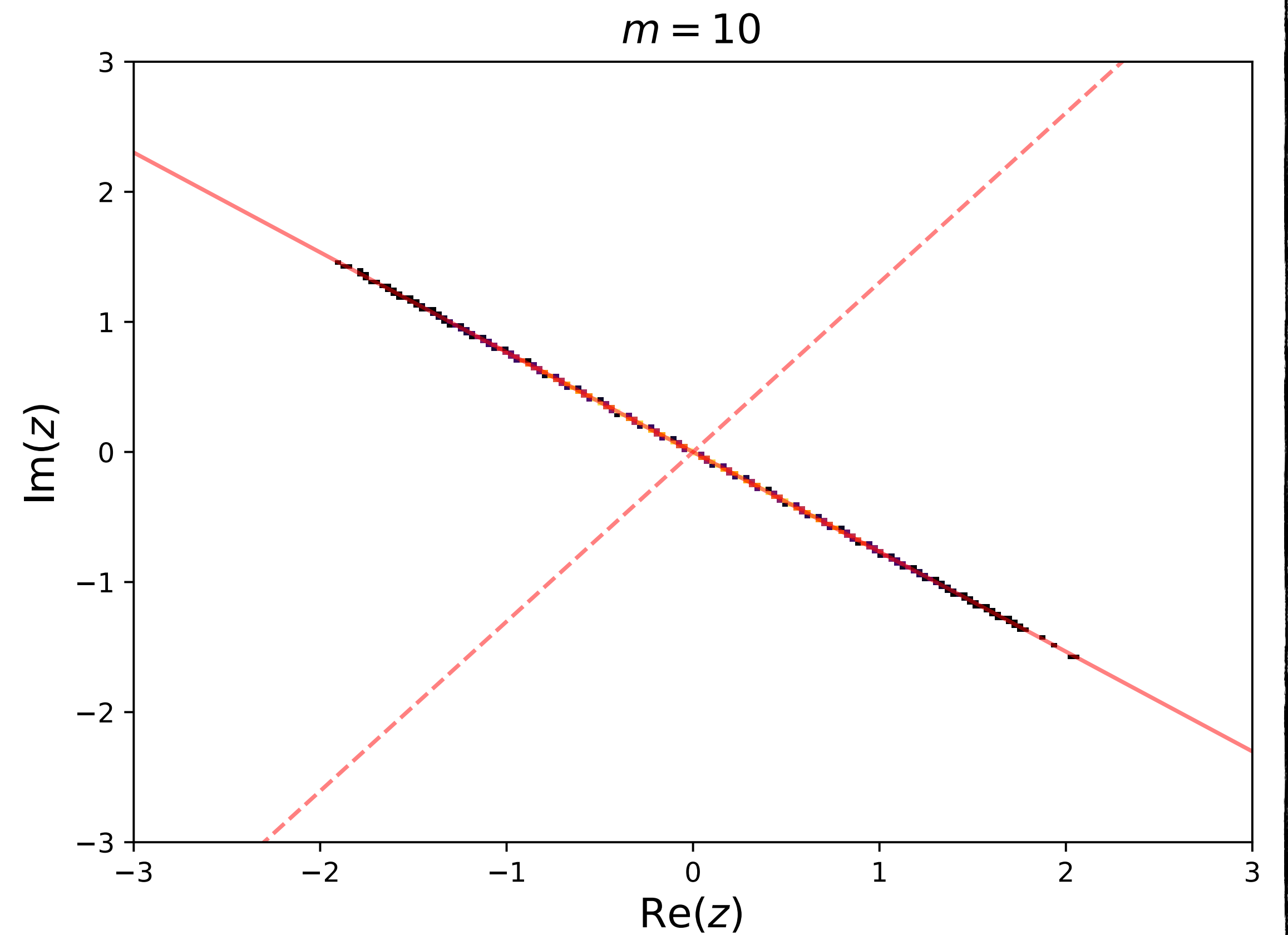
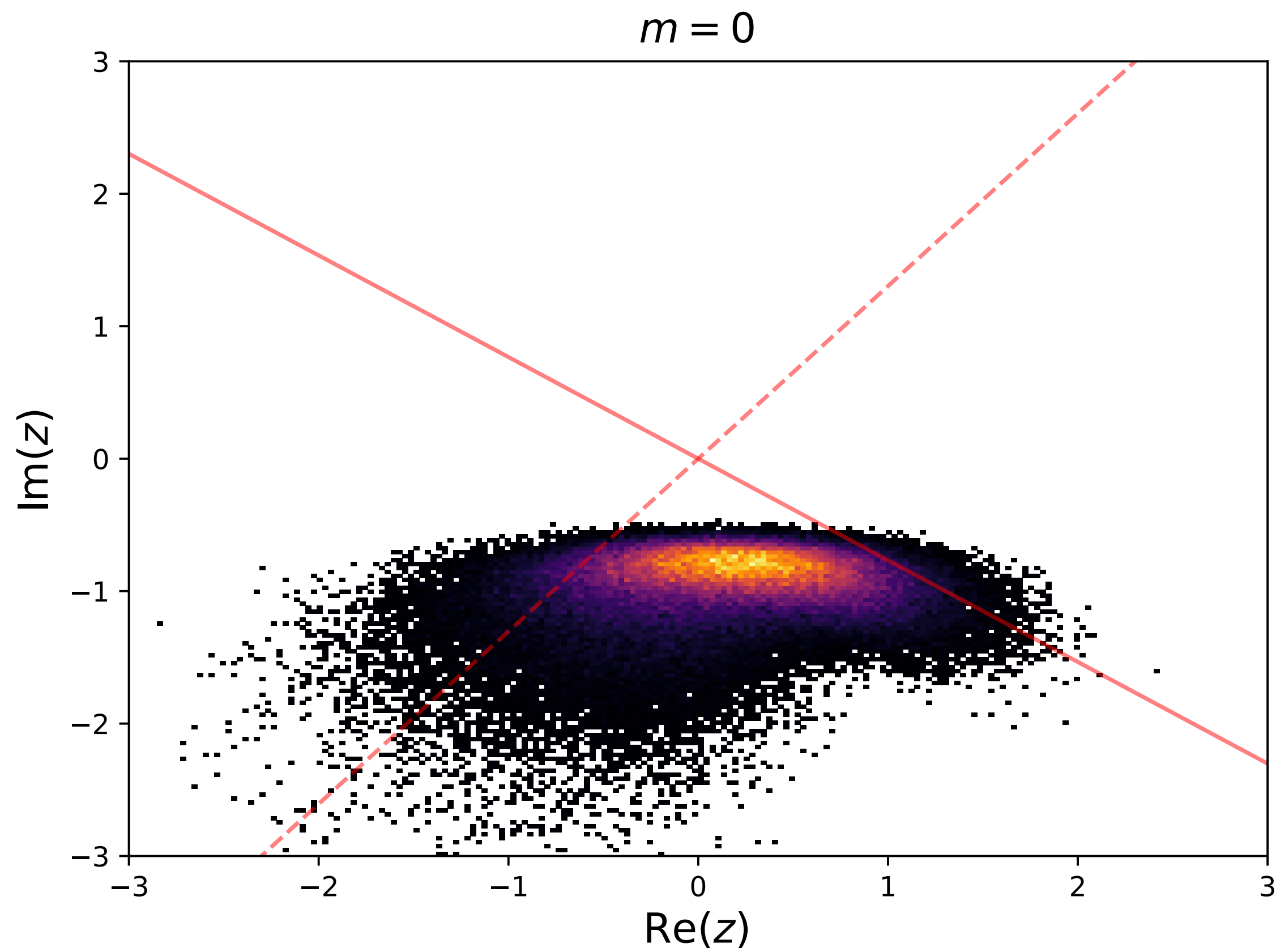
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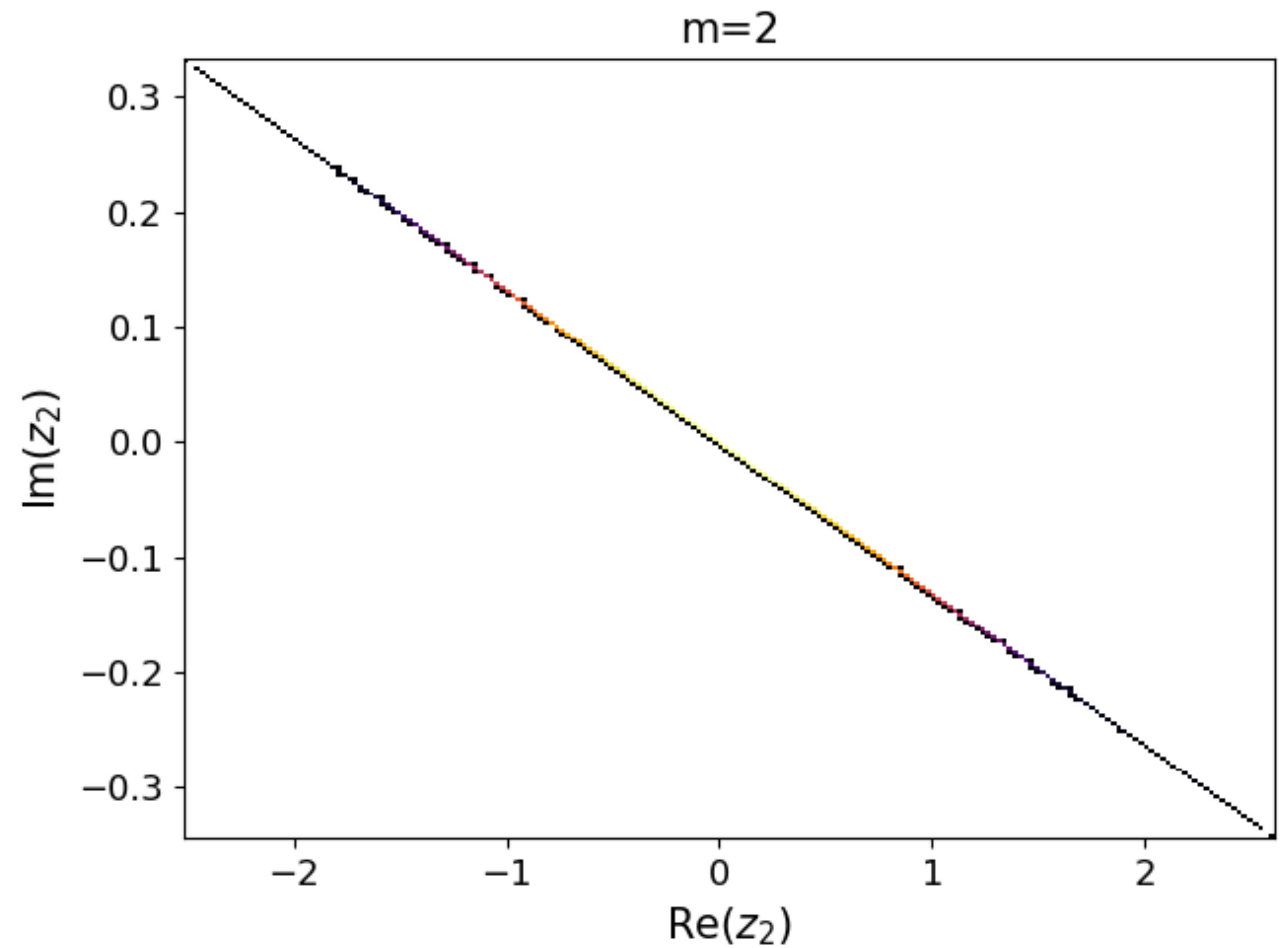
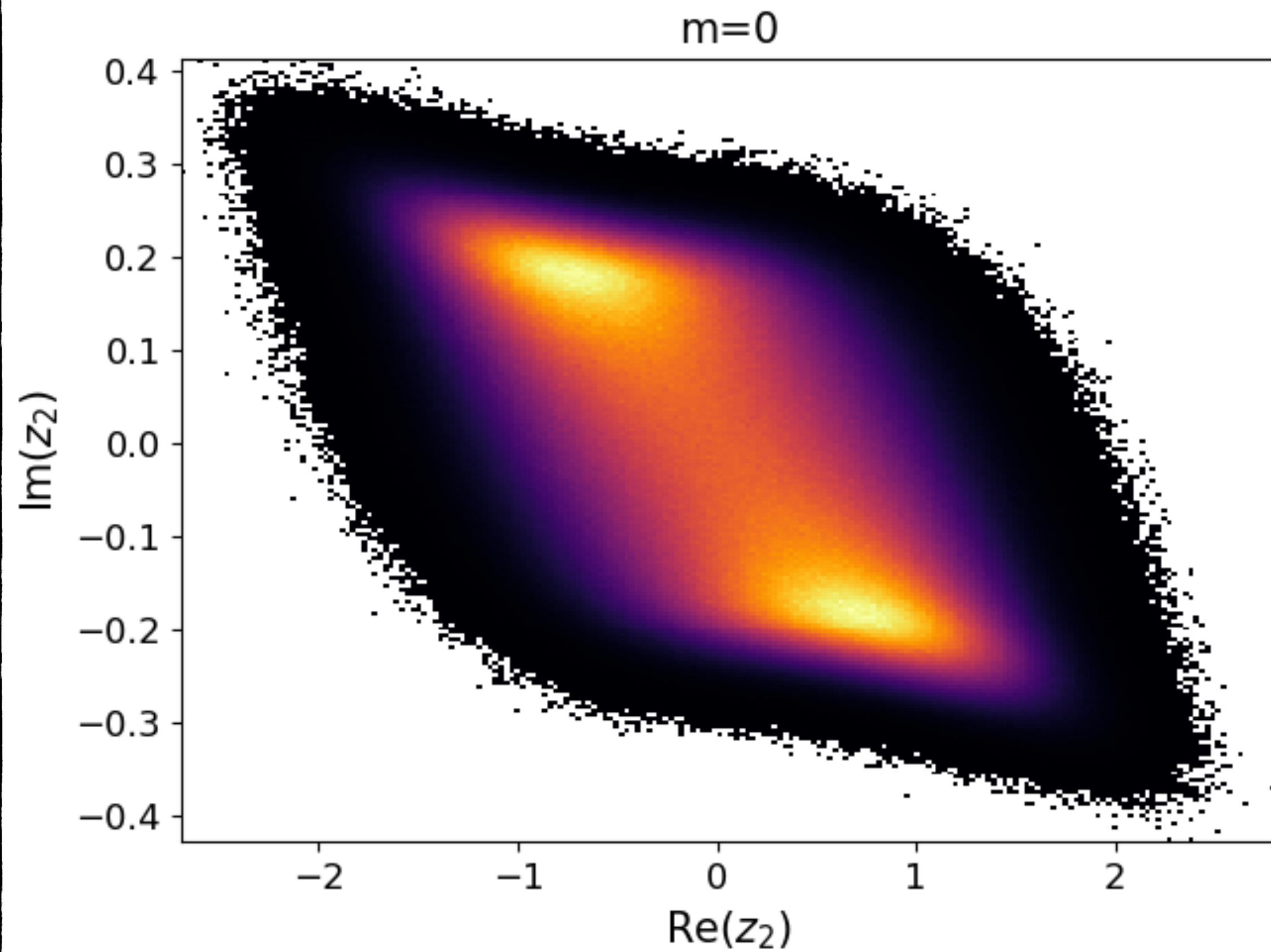
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  - (Heavy-dense) QCD with kernels.

**Backup**

# Effect of a kernel in 1D



# Effect of a kernel in 2D



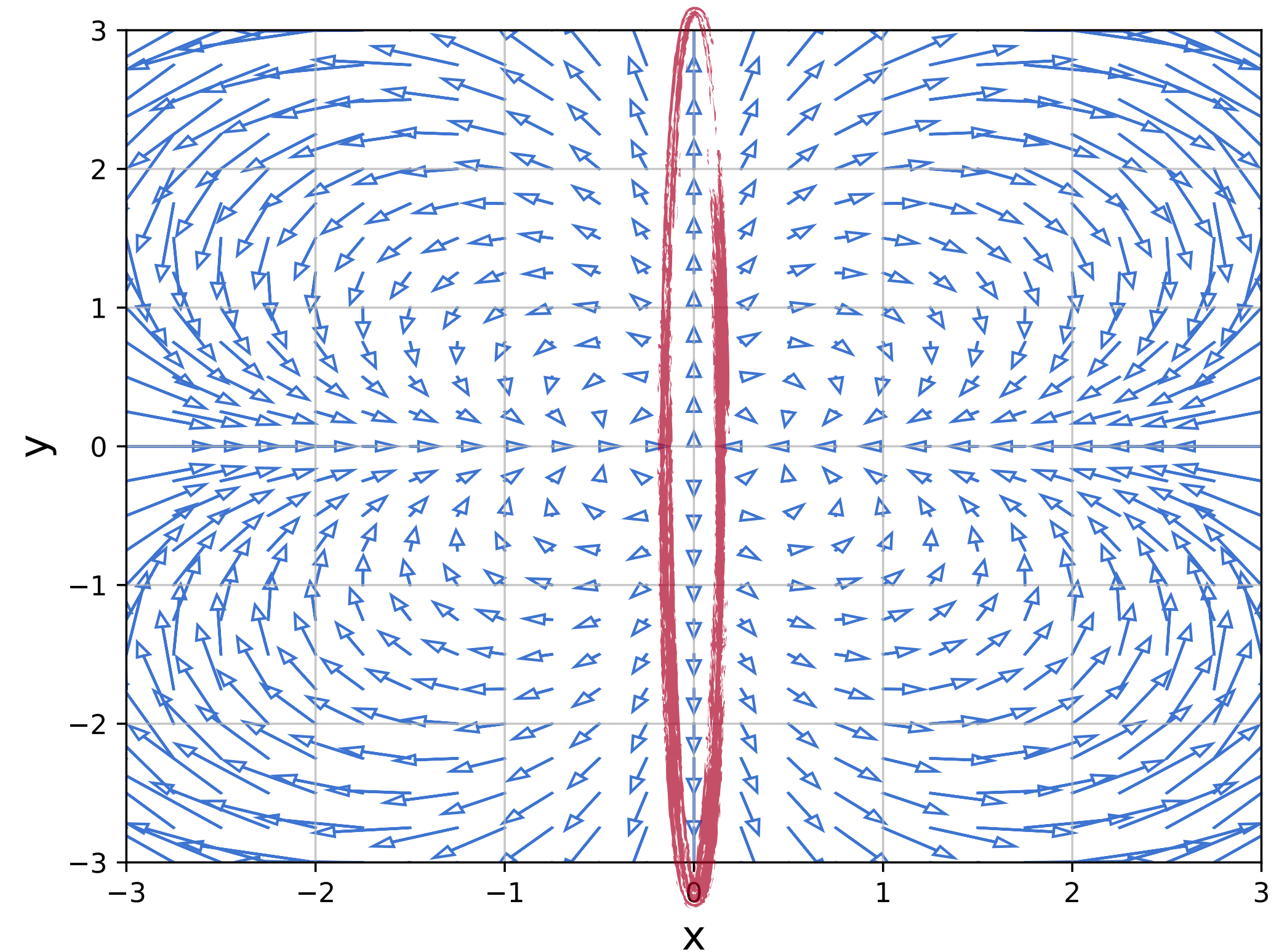


# Runaways

$$z \rightarrow z - \frac{\partial S(z)}{\partial z} \varepsilon + \sqrt{\varepsilon} \eta$$

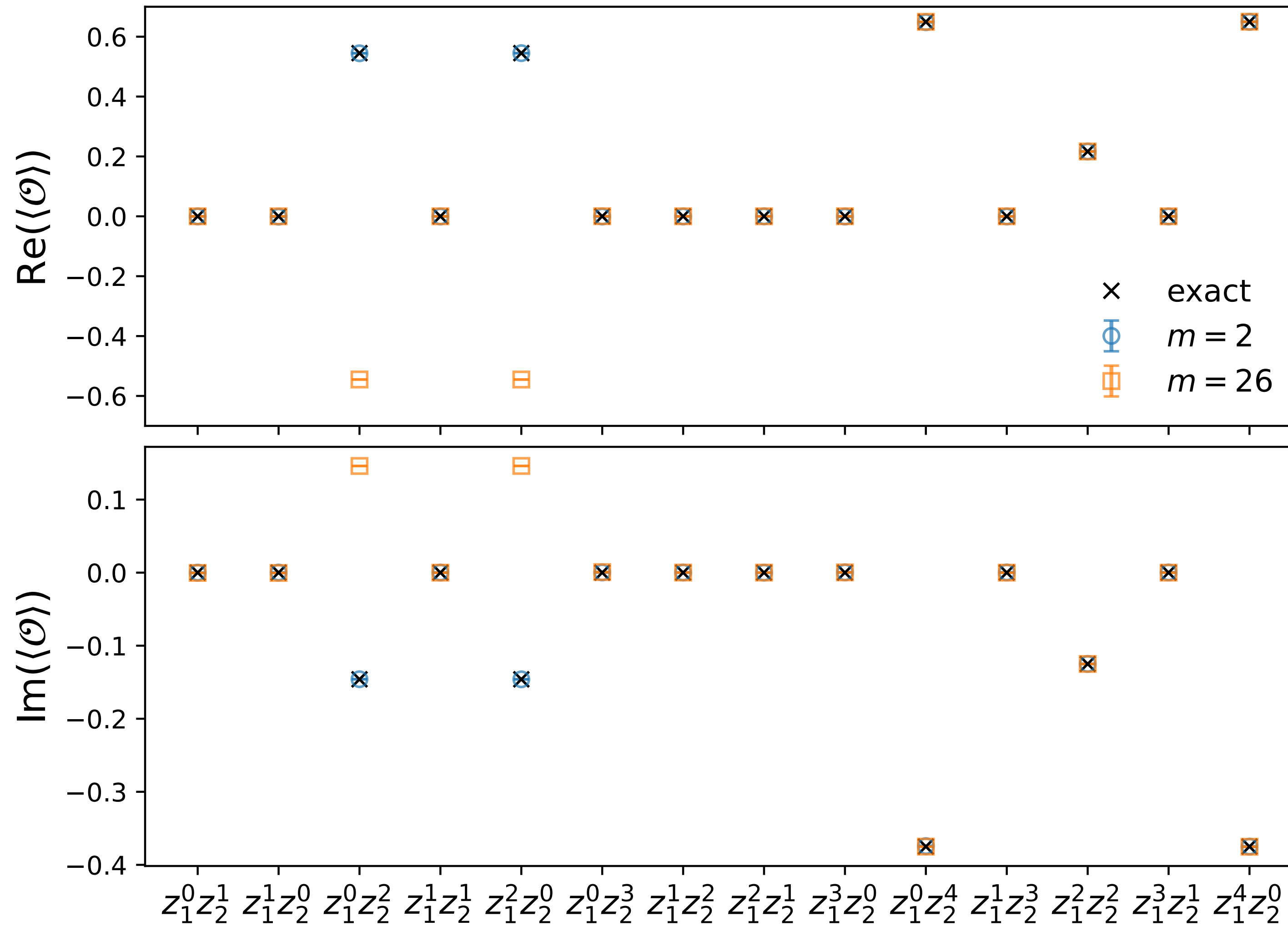
- Example:  $S(z) = \frac{z^4}{4}$ .
- Complexification can introduce **runaway trajectories** leading to diverging simulation.
- Overcome via **adaptive step-size control**.

Aarts et al. '10





# Integration cycles in higher dimensions



# Integration cycles in higher dimensions

$$S(z_1, z_2) = \frac{\lambda}{4}(z_1^4 + z_2^4 + az_1^2z_2^2)$$

$a = 0$

$a = 1$

