

FWWF

International Symposium on Lattice Field Theory 2024

# Designing weight regularizations based on Lefschetz thimbles to stabilize complex Langevin

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In collaboration with Kirill Boguslavski and David I. Müller

# Content & motivation

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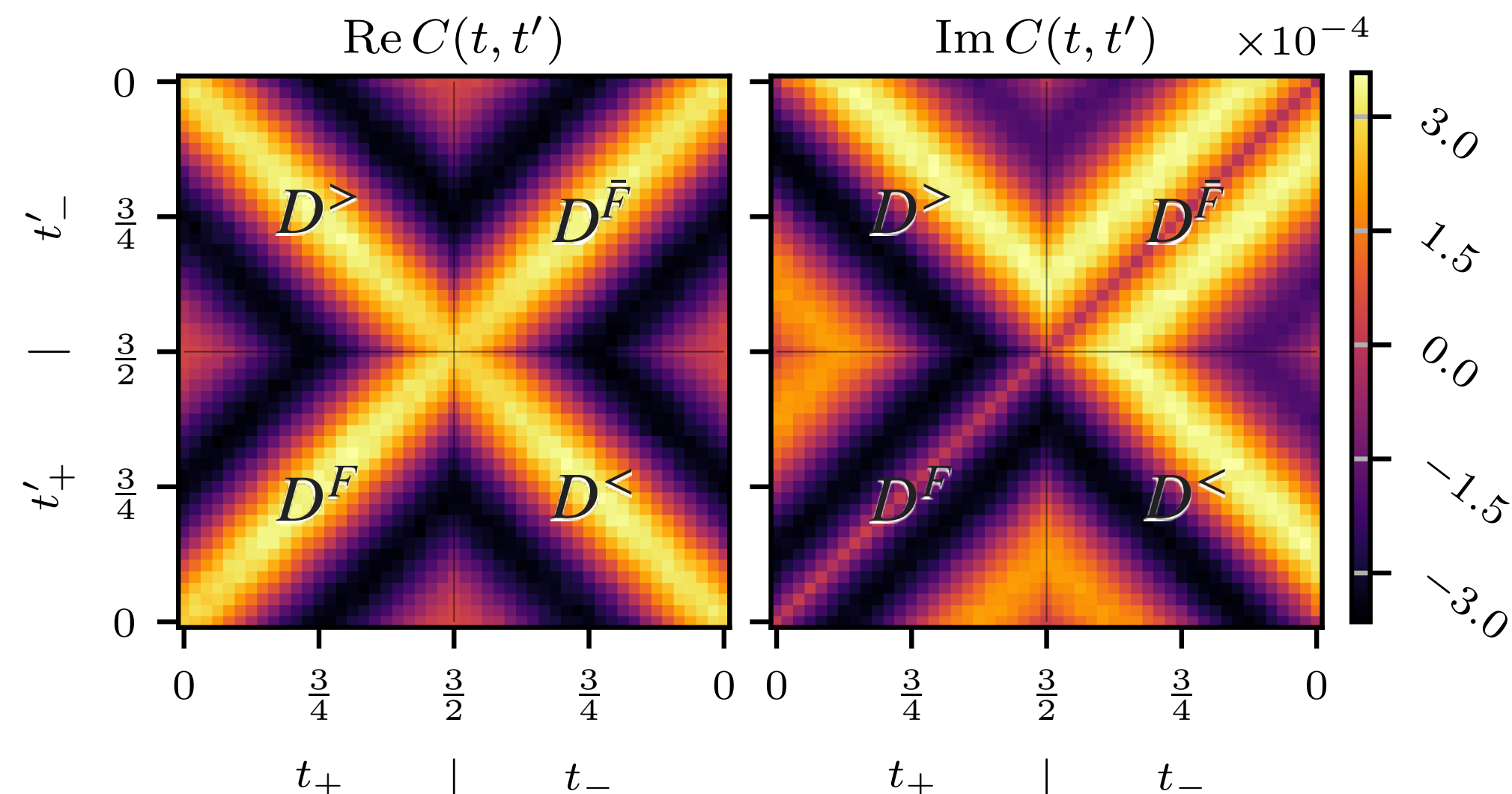
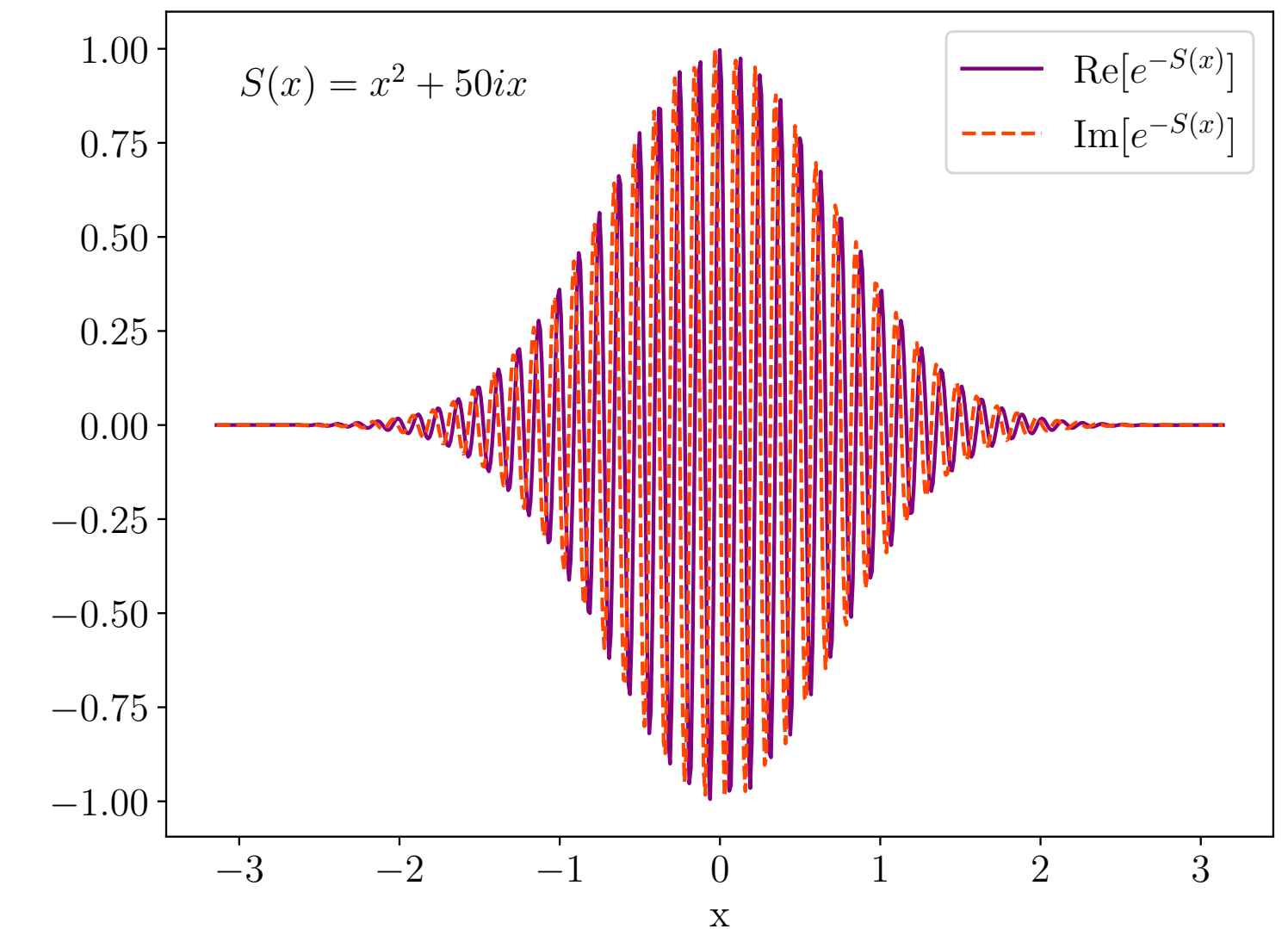
1. Introduction: Complex Langevin & Lefschetz thimbles
2. Cosine model: A toy model where CL fails
  - Explicit check of the criterion of correctness
  - Weight regularizations: a cure for the wrong convergence
3. Reduced Polyakov loop model
  - Thimble structure depends on the coupling
4.  $SU(N)$  Polyakov loop model
  - Extending regularization ideas to  $SU(N)$  gauge theory
5. Outlook and conclusion

Introduction to  
the **complex Langevin method**  
and **Lefschetz thimbles**

# What we are trying to achieve?

Computing... the non-deterministic polynomial hard way...

- **Expectation values:**  $\langle \mathcal{O} \rangle = \frac{1}{Z} \int dx e^{-S(x)} \mathcal{O}(x), \quad Z = \int dx e^{-S(x)}$
- If  $S$  is *real*,  $e^{-S(x)}/Z$  is a probability density  $\rightarrow$  Monte Carlo
- If  $S$  is *complex* this does not apply  $\rightarrow$  **Sign problem**



We achieved the **first results in real-time Yang-Mills results in 1+3D** (see [arXiv:2312.03063](https://arxiv.org/abs/2312.03063))

... at small bare couplings ...

$\rightarrow$  extension likely needs more work to be comp. feasible

# Introduction to complex Langevin (1/2)

A naive generalization of real Langevin

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- **Langevin equation:**

$$\partial_{\theta}x(\theta) = K(x(\theta)) + \eta(\theta)$$

auxiliary time  $\theta$

- Drift term:  $K(z(\theta)) = -S'(z(\theta))$  — describes classical evolution
- Gaussian noise:  $\eta(\theta)$  — encodes the quantum fluctuations
- **Real action  $S$ :** fields  $A$  are characterized by the limiting probability density  $P(\theta \rightarrow \infty) \propto e^{-S}$
- **Complex action  $S$ :** drift term is complex — we need to complexify the dyn. variables  $x \rightarrow z = x + iy$



# Introduction to complex Langevin (2/2)

A less naive generalization of real Langevin

- **Expectation values with complex Langevin:**

$$\langle \mathcal{O} \rangle = \frac{1}{Z} \int_D dx \exp[-S(x)] \mathcal{O}(x) = \lim_{\Theta \rightarrow \infty} \int_{\theta_0}^{\theta_0 + \Theta} d\theta \mathcal{O}(z(\theta))$$

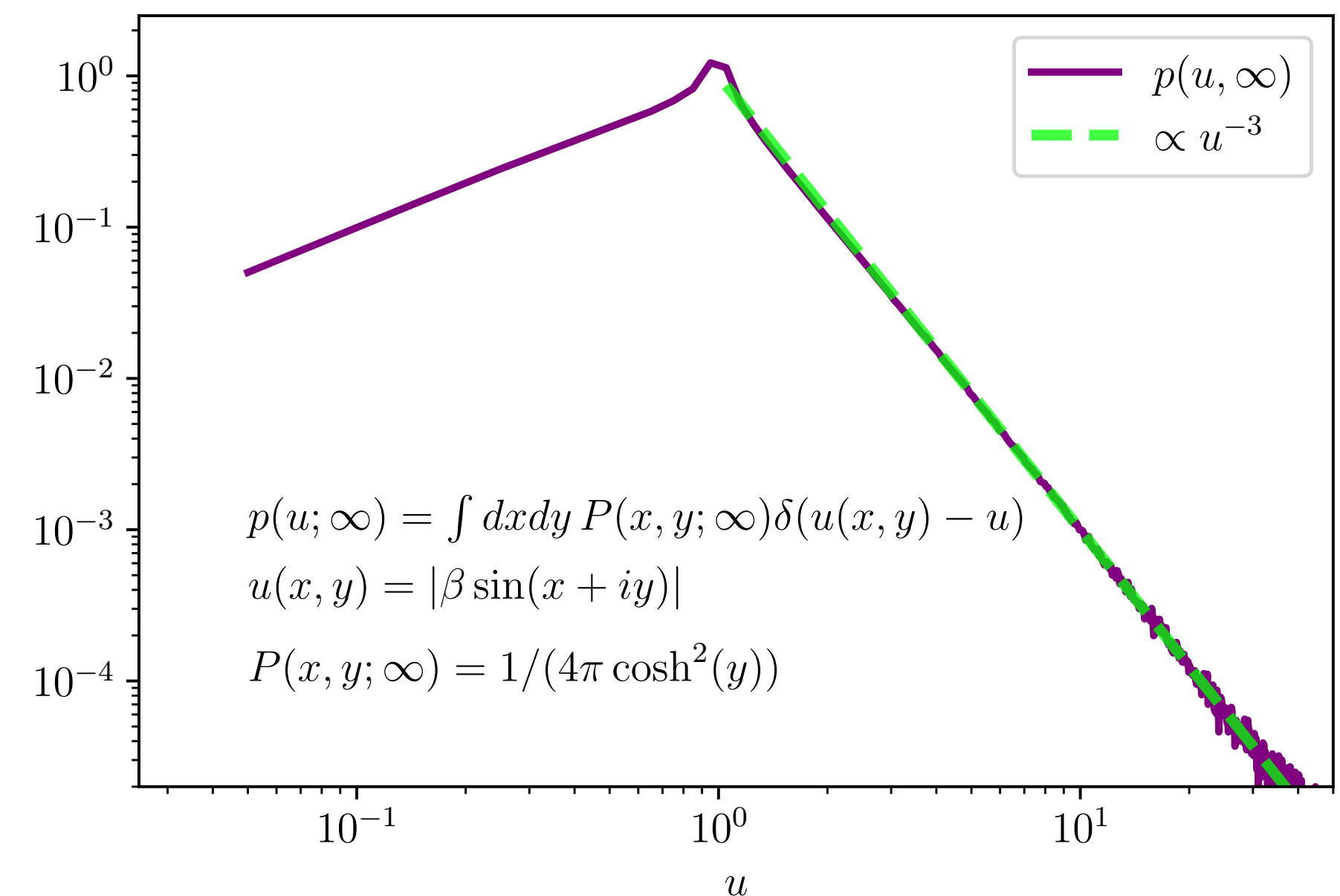
- Correspondence to Fokker-Planck equation:  $\partial_\theta P(x, y; \theta) = L^T P$ ,  $L^T = \partial_x(\partial_x + \text{Re}K) + \partial_y \text{Im}K$

- **Criterion of correctness** — we know when it fails:

- Density of drift magnitude has to decay exponentially

$$p(u; \theta) = \int dx \int dy \delta(u - u(z)) P(x, y; \theta), \quad u(z) = |K(z)|$$

- **But what shall we do if the criterion is not satisfied?**



# Lefschetz thimble approach

Application of the Cauchy's theorem to the path integral

- Complexify the dynamical variables:  $x \rightarrow z = x + iy$

$$Z = \int_D dz \exp(-S(z)) = \sum_{\sigma} n_{\sigma} e^{-i\text{Im}[S(z_{\sigma})]} \int_{D_{\sigma}} dz e^{-\text{Re}[S(z)]} =: \sum_{\sigma} n_{\sigma} e^{-i\text{Im}[S(z_{\sigma})]} Z_{\sigma}$$

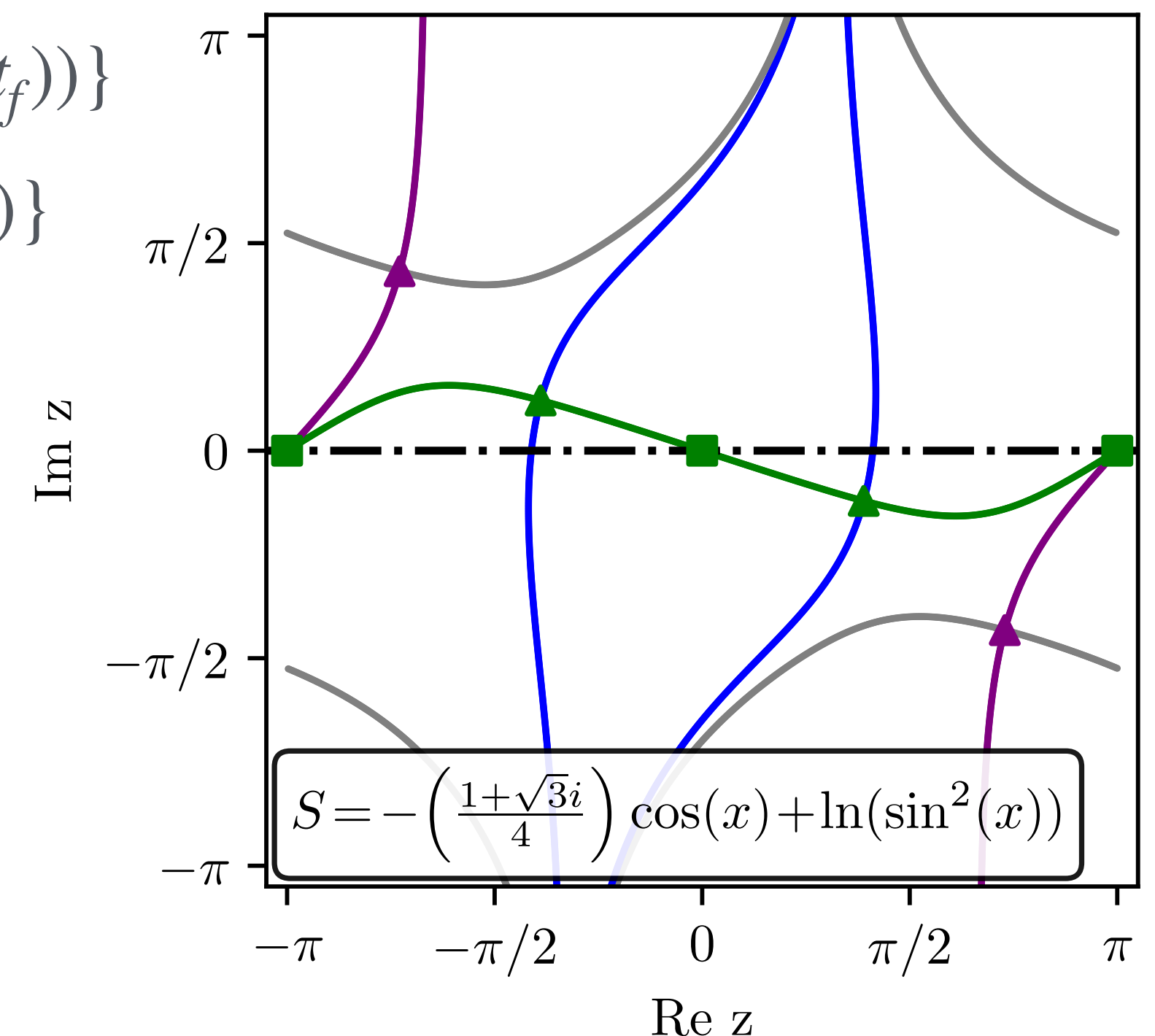
( $n_{\sigma}$  number of intersections of  $K_{\sigma}$  and  $D$ ,  $z_{\sigma}$  are stationary points of the action  $S$ )

- Thimbles (SD paths):  $D_{\sigma} := \{z(t_f) \in \mathbb{C} : z(-\infty) = z_{\sigma}, \dot{z}(t_f) = -\bar{S}'(z(t_f))\}$
- Co-thimbles (SA paths):  $K_{\sigma} := \{z(t_f) \in \mathbb{C} : z(-\infty) = z_{\sigma}, \dot{z}(t_f) = \bar{S}'(z(t_f))\}$

- Expectation values with Lefschetz thimbles:**

$$\langle \mathcal{O} \rangle = \frac{\sum_{\sigma} n_{\sigma} e^{-i\text{Im}[S(z_{\sigma})]} Z_{\sigma} \langle \mathcal{O} \rangle_{Z_{\sigma}}}{\sum_{\sigma} n_{\sigma} e^{-i\text{Im}[S(z_{\sigma})]} Z_{\sigma}}$$

Monte Carlo feasible!

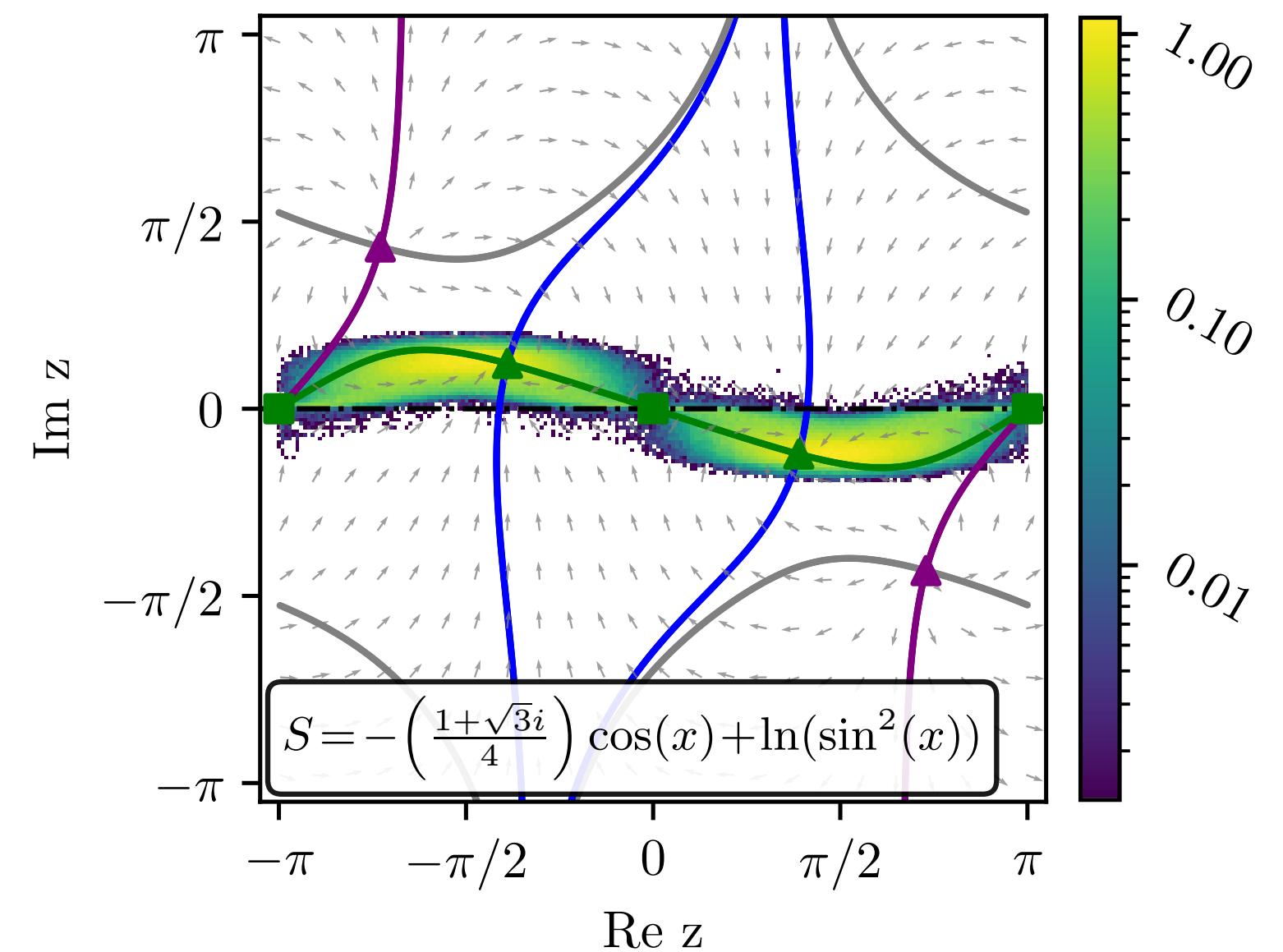


# Nothing but intuition and a hunch...

Connection between Lefschetz thimbles and complex Langevin

## Similarities between CL and LT:

1. Analytical continuation of theories
2. Introduction of auxiliary times  $\theta$  and  $t_f$
3. CL drift term  $-S'$  and flow equation  $-\bar{S}'$



**Complex Langevin is sometimes considered to be an “important sampling near to thimbles”**

→ rather an important sampling near attractive stationary points

- Connection is not well understood — is the criterion of correctness for CL linked to LT?
- **We use the Lefschetz thimble as a tool to regularize for complex Langevin!**



Total failure of complex Langevin:  
**Complex cosine model**

# Complex cosine model

Non-trivial but fully controlled model with wrong convergence of CL

- **Weight function** of complex cosine model:

$$\rho(x) = e^{-i\beta \cos(x)}, \beta \in \mathbb{R}$$

- **Stationary solution** of the stochastic process:

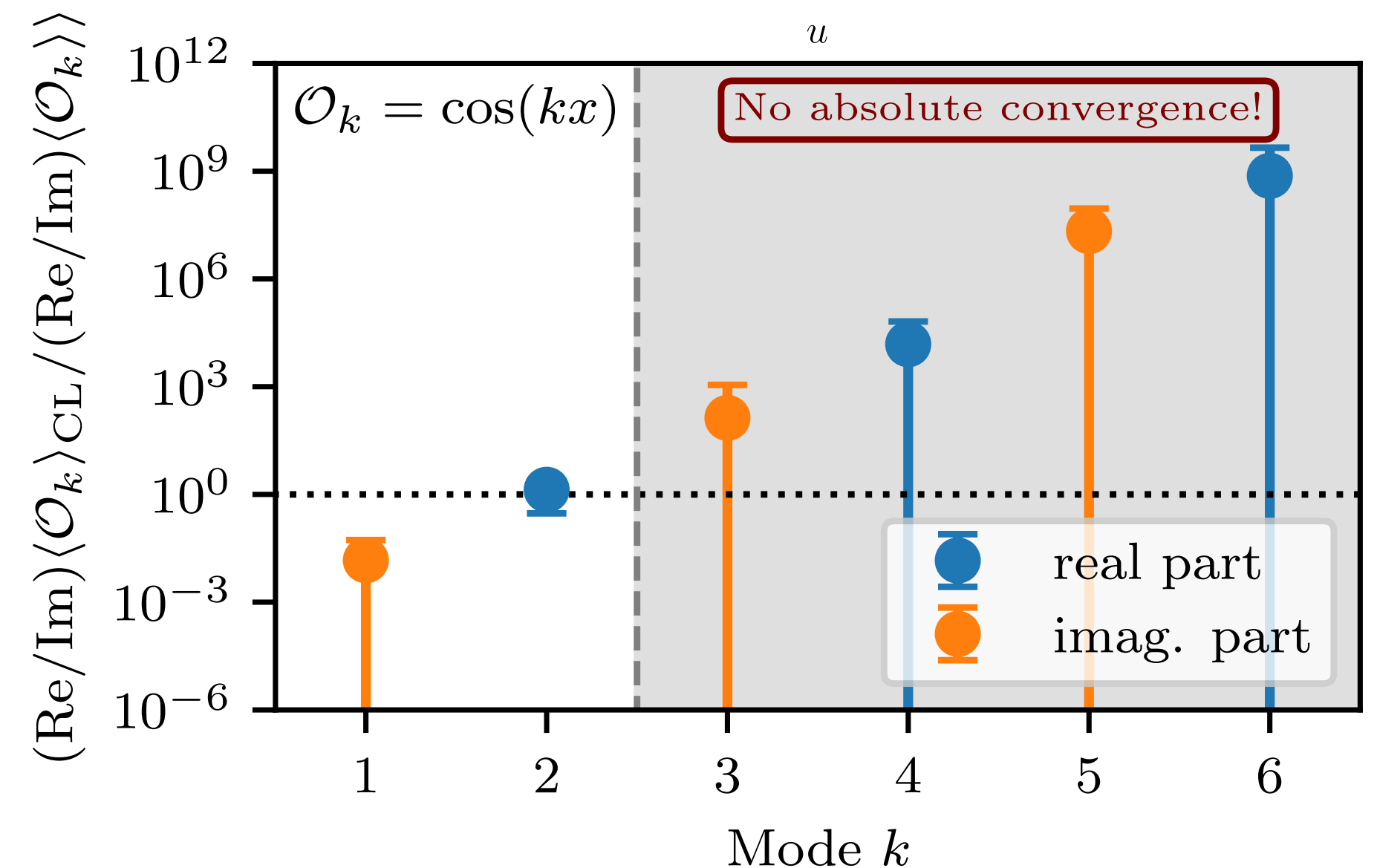
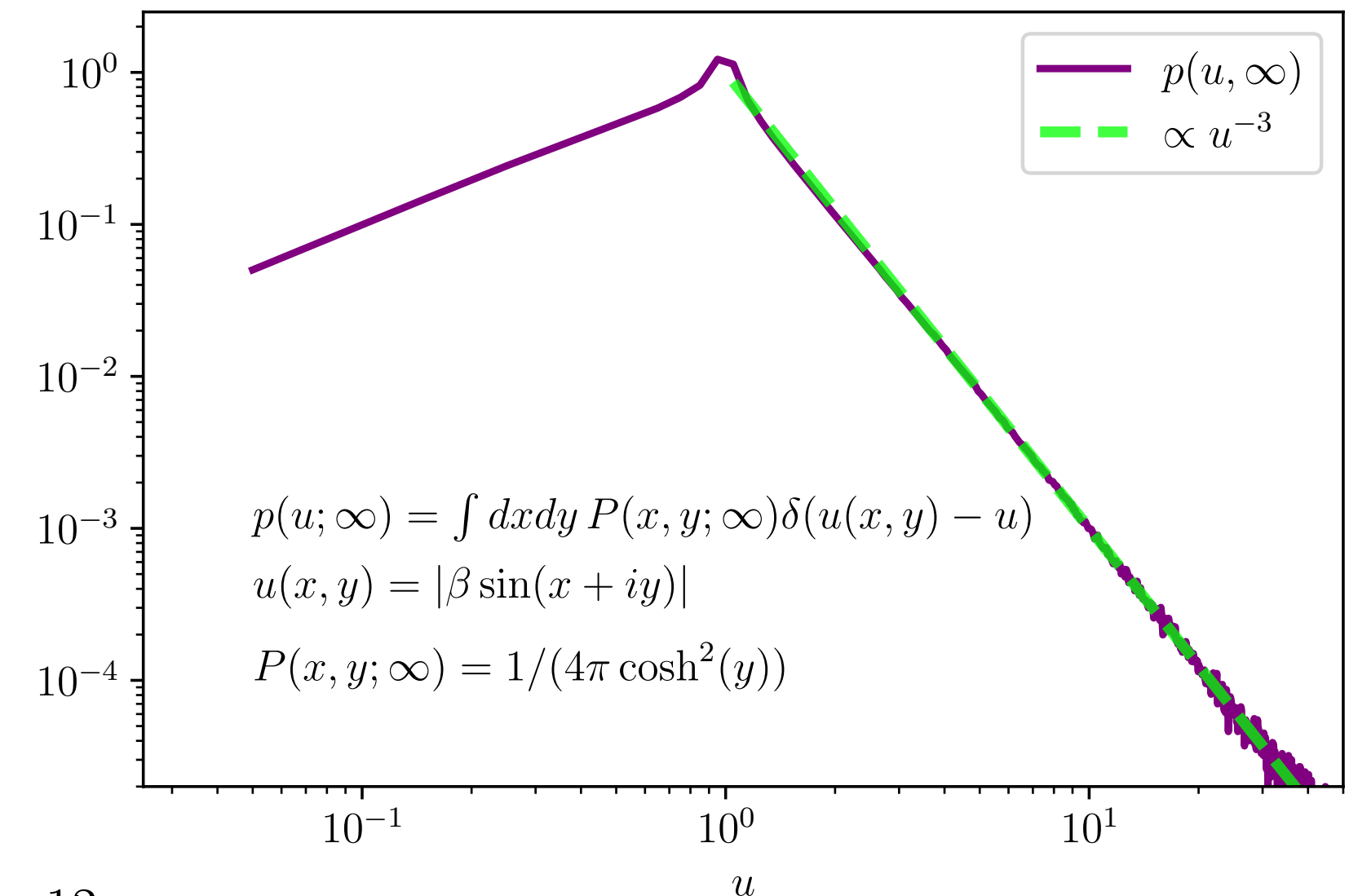
$$P_{\text{st}}(x, y) = \frac{1}{4\pi \cosh^2(y)}$$

- **Criterion of correctness is not satisfied:**

- Emergence of boundary terms [[arXiv:1808.05187](https://arxiv.org/abs/1808.05187)]
- Decay of density of drift magnitude (right figure)

- Analytic expectation values (bottom figure):

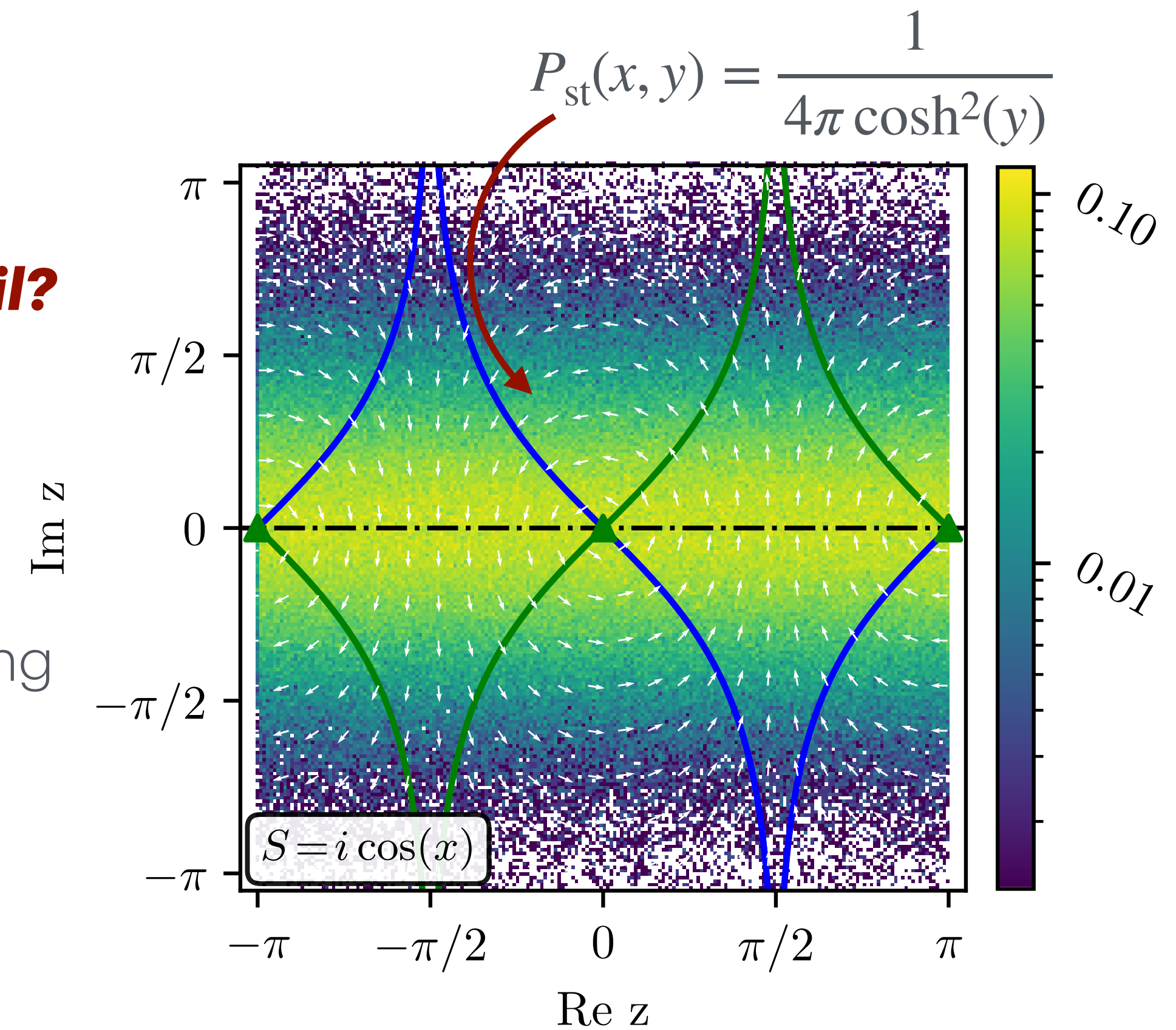
$$\langle \mathcal{O}_k \rangle = \int_{[-\pi, \pi]} dx \rho(x) \cos(kx) = (-1)^k \frac{J_k(\beta)}{J_0(\beta)}$$



# Thimbles of the cosine model

Simple structure with obvious consequences

- Established “criteria of correctness” or **mostly diagnostic**
    - Decay of drift magnitude
    - Boundary terms
- What should we do if they fail?**
- Lefschetz thimbles might allow for a more detailed understanding of the Langevin dynamics:
    - Attractive/repulsive stationary points and singularities
    - Weights and probability currents



# Designing weight regularizations

If you cannot simulate the theory — change the theory

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- Add a **regularization term** to the original weight

$$\rho(x) \rightsquigarrow \rho_R(x) := \rho(x) + R(x)$$

- We modify/“regularize” the weight with three objectives

1. **Stationary points** should be **close to the real line**
2. **Singularities** that connect to contributing thimbles should be **on the real line**
3. We want to **avoid any asymptotic structure** of contributing thimbles (“tamed” thimbles)

*Similar ideas have been investigated before:*

Z. Cai et al arXiv:2109.12762  
F. Attanasio et al arXiv:1808.04400  
A. C. Loheac et al arXiv:1702.04666  
S. Tsutsui et al arXiv:1508.04231

...

In general those objectives are not achievable for neutral regularization — **expectation values change and we need to compute corrections!**

# Curing the criterion of correctness

Regularization cures the wrong convergence issue

- **Regularization of the cosine model**

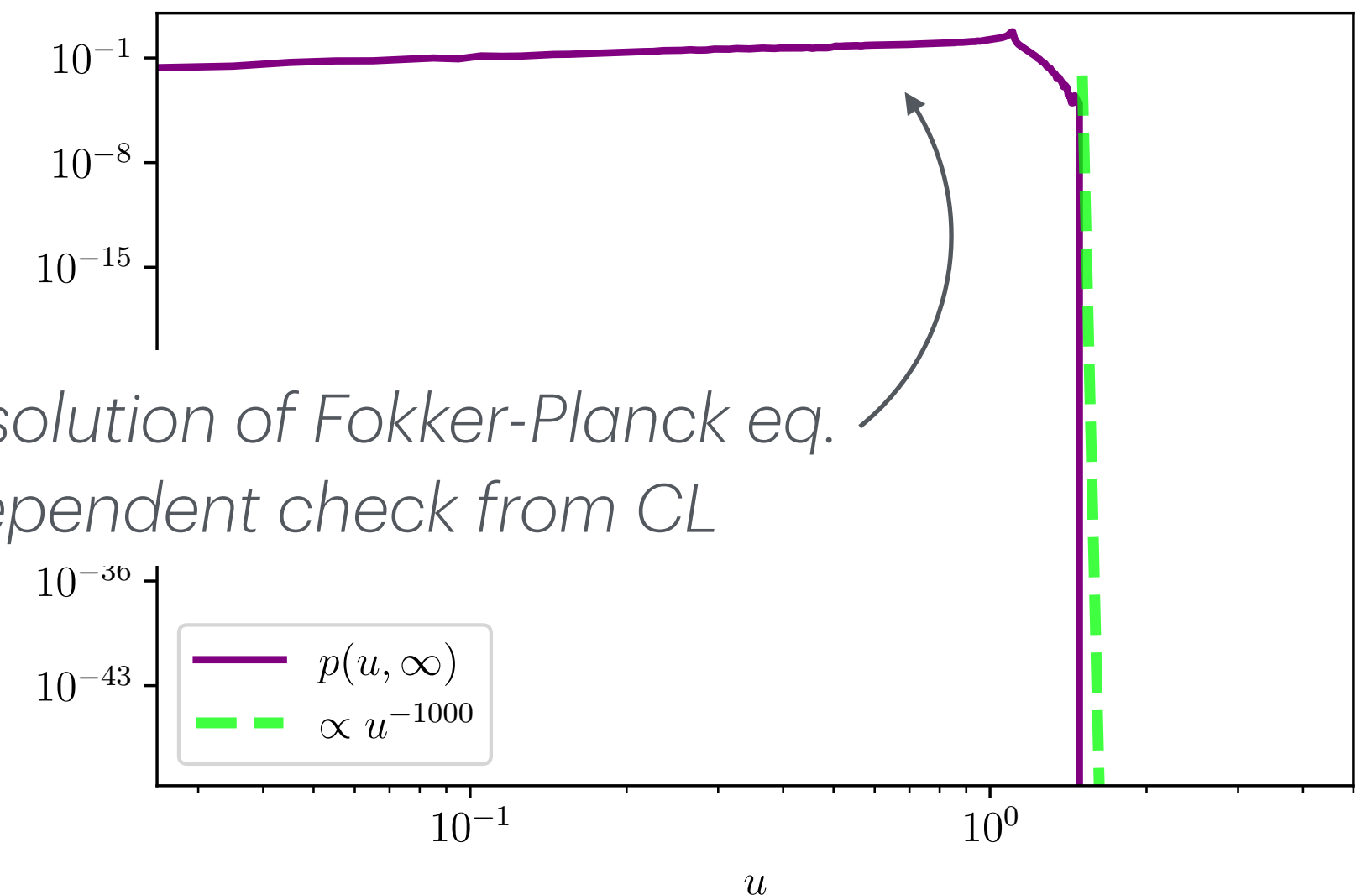
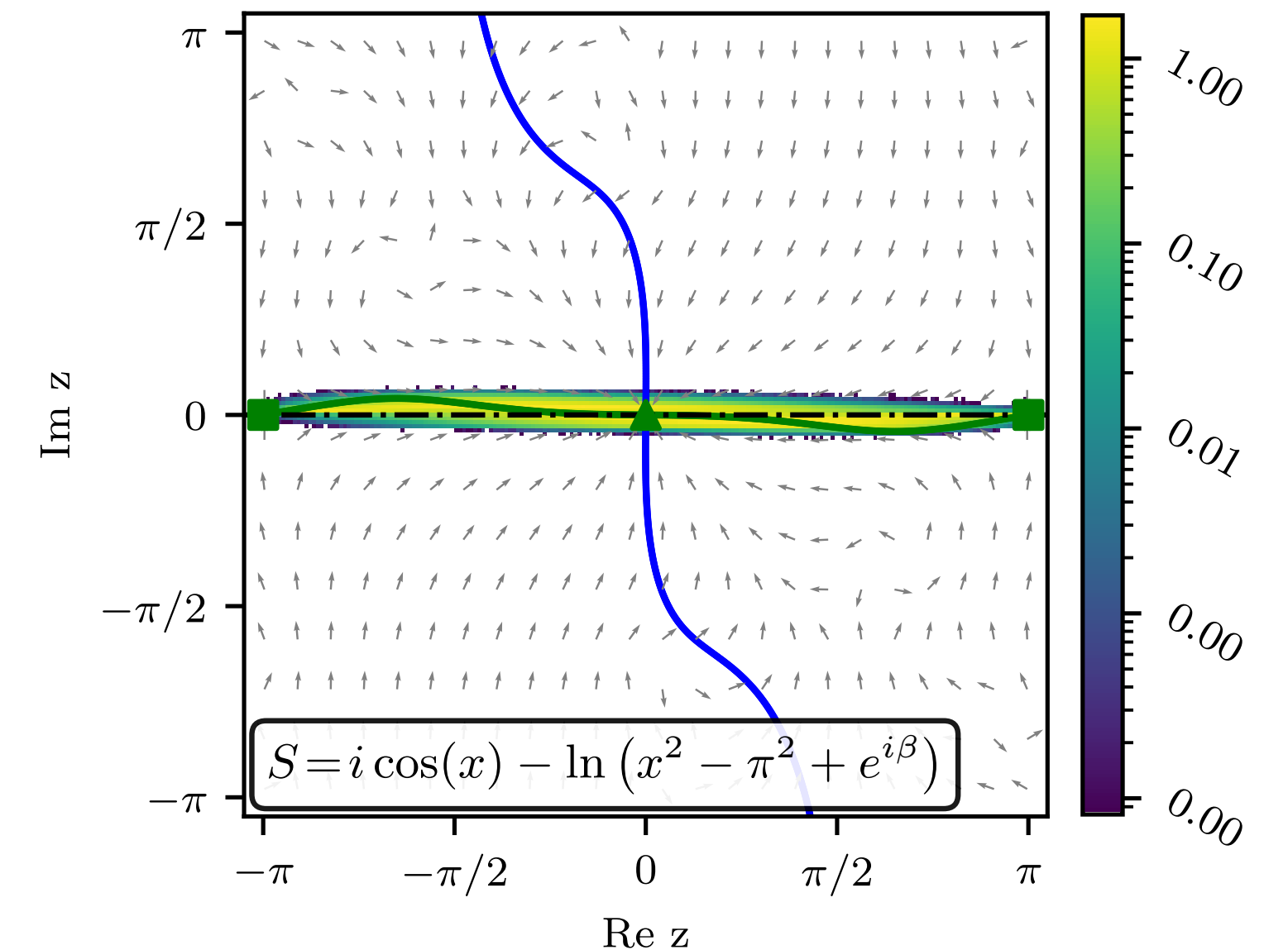
$$\rho_R(x) = e^{i\beta \cos(x)} + R(x)$$

$$R(x) = r(x^2 - \pi^2) - \exp(i\beta), r \in \mathbb{C}$$

- **Regularization term achieves our goals:**

1. Polynomial term leads to one stationary point at the origin
2. Constant shifts singularities to the  $\pm\pi$
3. No asymptotic structure of thimbles, for  $|r| \rightarrow \infty$  we have the drift:

$$\text{Im} [K_R(x + iy)] = -y \left[ \frac{1}{(x - \pi)^2 + y^2} + \frac{1}{(x + \pi)^2 + y^2} \right]$$



# Corrections for regularizations

Apriori knowledge allows computation of correction term

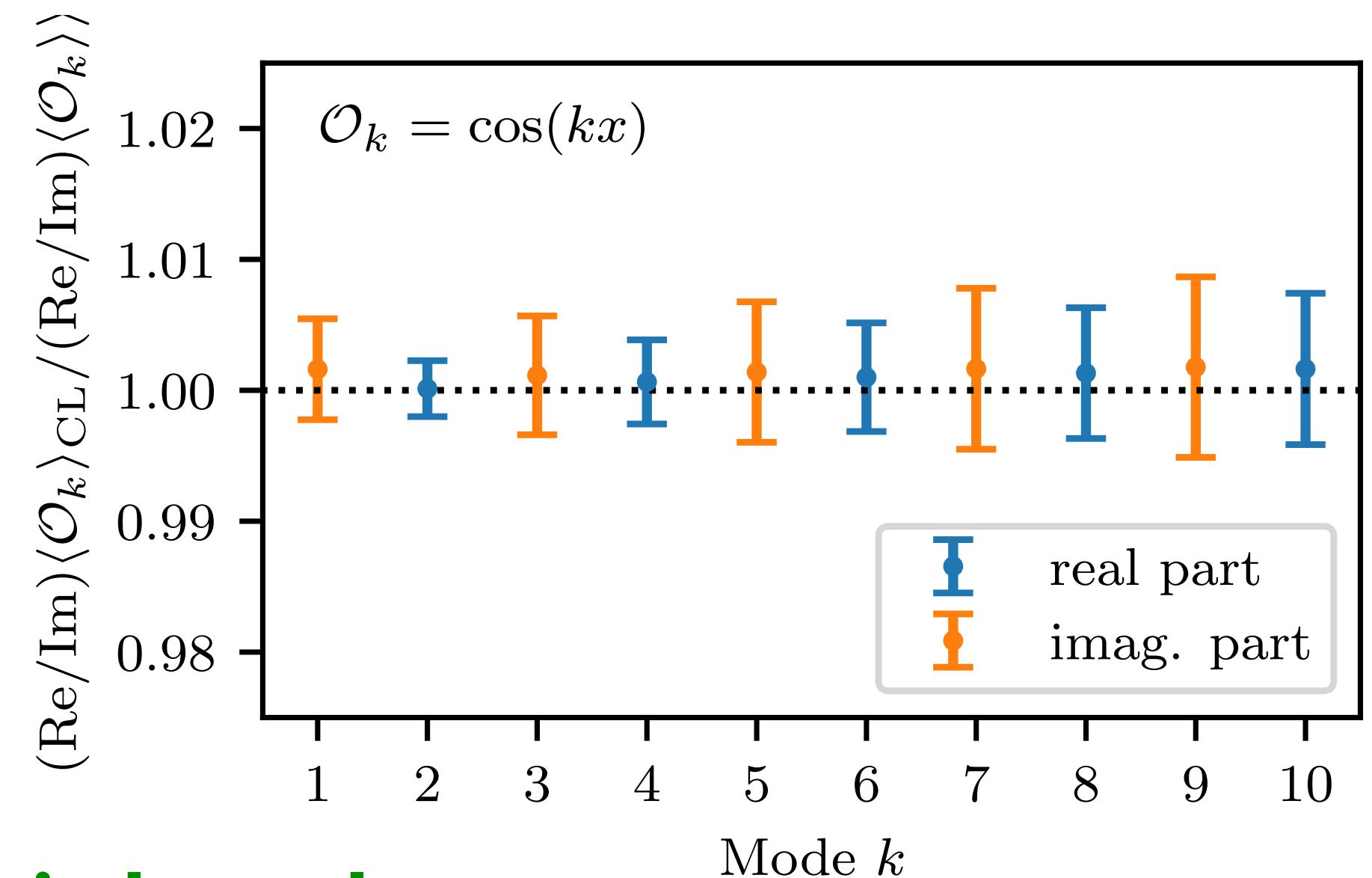
- **Correction term** for regularized expectation values

$$\langle \mathcal{O} \rangle_\rho = \langle \mathcal{O} \rangle_{\rho_R} + \text{Corr}_R(\mathcal{O})$$

$$\text{Corr}_R(\mathcal{O}) = (\langle \mathcal{O} \rangle_{\rho_R} + \langle \mathcal{O} \rangle_R)Q, \quad Q = \frac{Z_R}{Z_\rho}$$

- How to compute **the bad guy Q?**

→ **Apriori knowledge of the original system — observable independence**



*Vanishes for  $r \rightarrow \infty$ !*

Dyson-Schwinger equation:

$$\langle \mathcal{O}^* \rangle_\rho = \langle \mathcal{O}' - \mathcal{O}S' \rangle_\rho = 0 \rightarrow Q = \frac{\langle \mathcal{O}^* \rangle_{\rho_R}}{\langle \mathcal{O}^* \rangle_R - \langle \mathcal{O}^* \rangle_{\rho_R}}$$

Option for the cosine model:

$$\mathcal{O}^* = \cos(x) + i\beta \sin(x)\cos(x)$$

A model where CL fails, depending on the coupling:  
**Polyakov loop model**

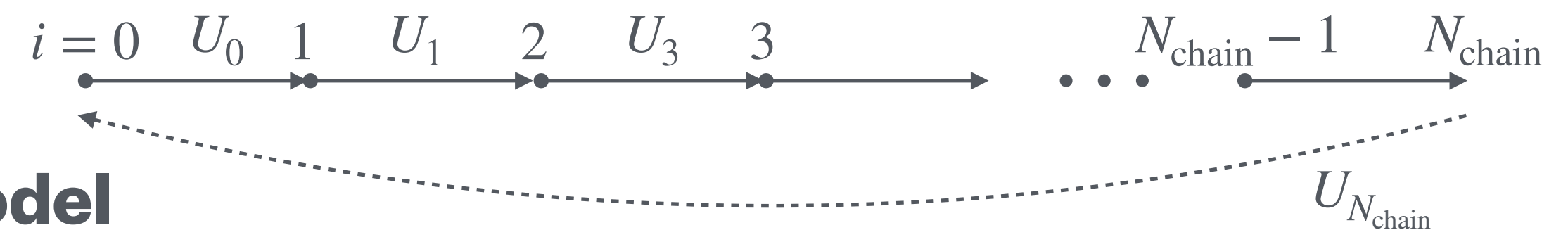
# Reduced Polyakov loop model (1/2)

Reducing a gauge theory to a scalar theory

- **Polyakov loop action** in  $SU(2)$  ( $SU(3)$  is in progress):

$$S = -\beta \text{Tr}(P), \quad \beta \in \mathbb{C}$$

$$P = \prod_{i=0}^{N_{\text{chain}}} U_i, \quad U_i \in SU(N_c)$$



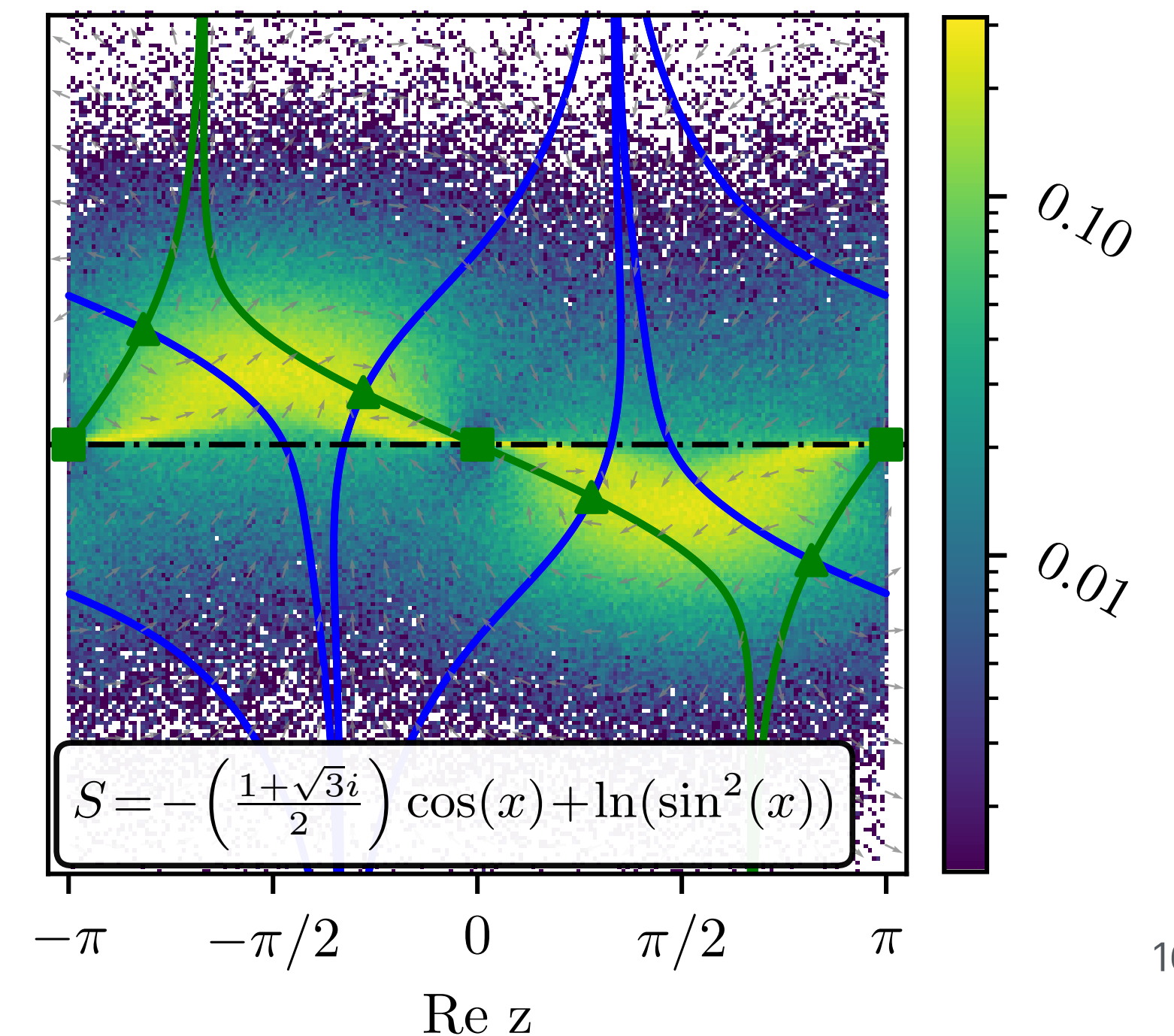
- Gauge freedom leads to equivalence to the **one-link model**

- **Reduction of the Haar measure**

$$\int_{SU(2)} dU e^{\beta \text{Tr}(U)} \rightsquigarrow \int_{-\pi}^{\pi} dx \sin^2(x) e^{2\beta \cos(x)}$$

- **Identify observables and (scalar) effective action**

$$S(x) = -2\beta \cos(x) - \ln(\sin^2(x)), \quad \text{Tr}(U) \leftrightarrow 2 \cos(x)$$



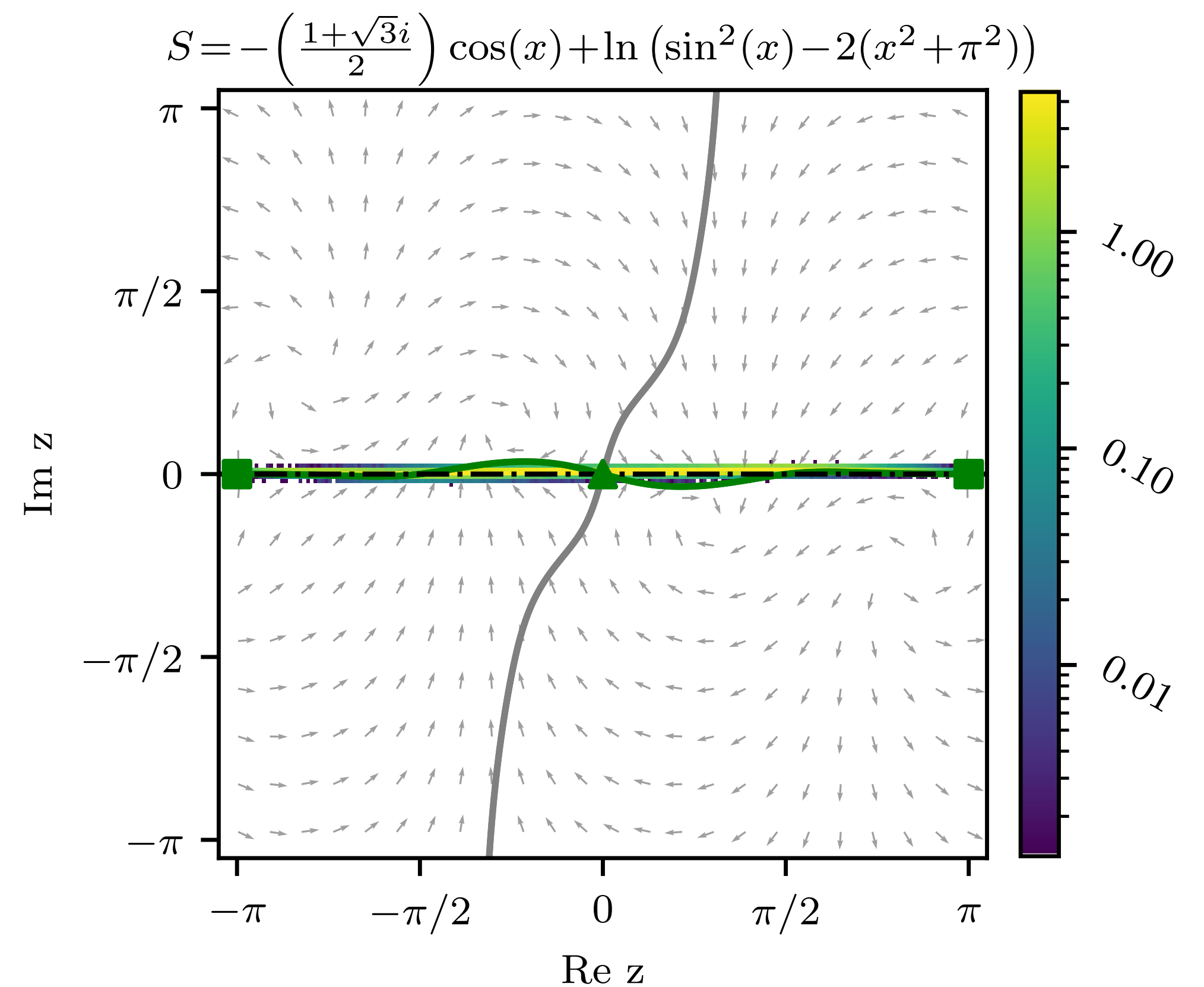
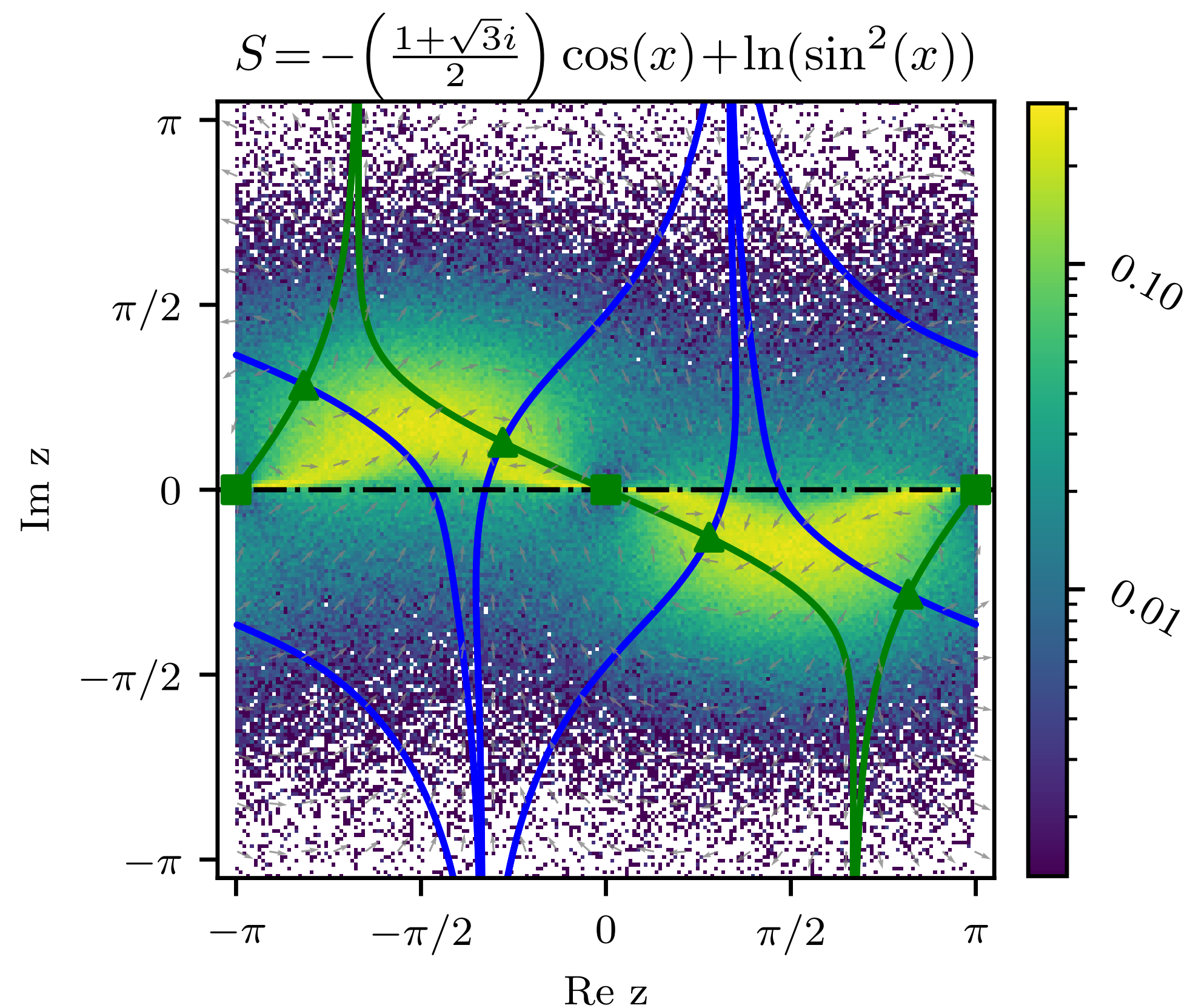


# Reduced Polyakov loop model (2/2)

Regulazing the reduced Polyakov — different model, same idea

**The same ideas as for the cosine model apply:**

$$\rho(x) = \exp[2\beta \cos(x) + \ln(\sin(x)^2)] \rightsquigarrow \rho_R(x) = \rho(x) + R(x) = \rho(x) + r(x^2 - \pi^2)$$



# Polyakov loop model (1/2)

Can we generalize these regularizations to SU(N) gauge theories?

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- **Action of the Polyakov loop model:**  $S[\{U_i\}] = -\beta \text{Tr} \left[ \prod_i U_i \right]$
- SU(N) is compact, for SU(2) the trace of the links is bounded:  $\text{Tr}[U] \in [-2, 2]$
- **The first thing that comes to mind ...**

$$\rho[\{U_i\}] = \exp[\beta \text{Tr}[P]] \rightsquigarrow \rho_R[\{U_i\}] = \rho[\{U_i\}] + R[\{U_i\}] = \rho(x) + r \left\{ (\text{Tr}[P]/N_c)^2 - 1 \right\}$$

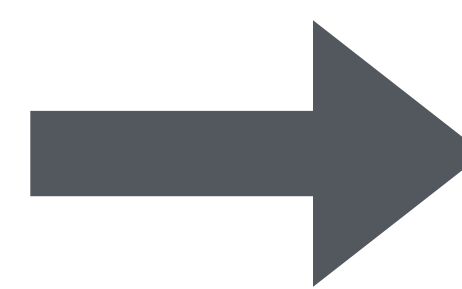
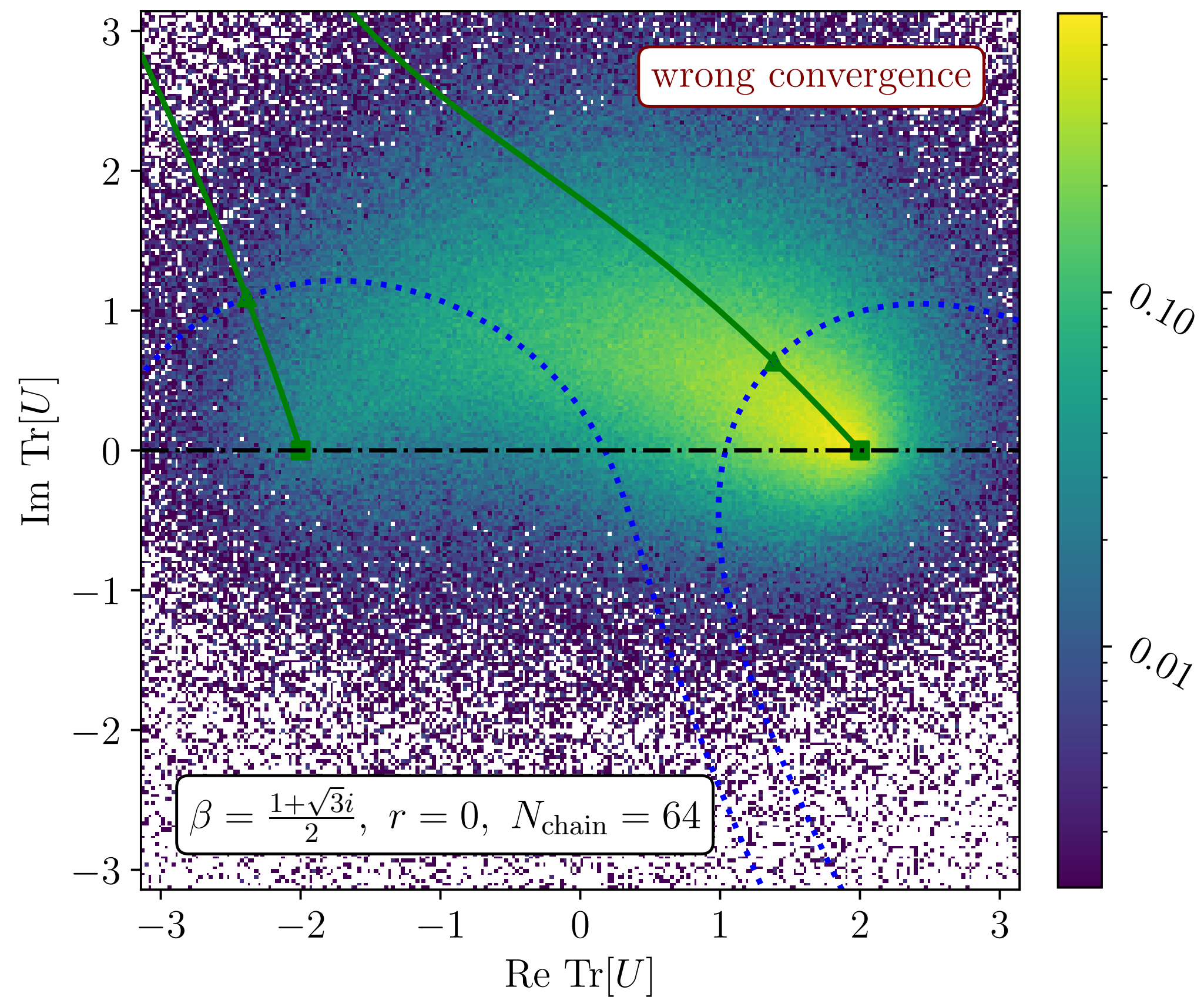
**... and it works.**

- Sidenote:  $\text{SL}(N_c, \mathbb{C})$  is non-compact! We use the gauge cooling technique to stabilize the system — however, we observed that we do not need it for large enough  $r$ .

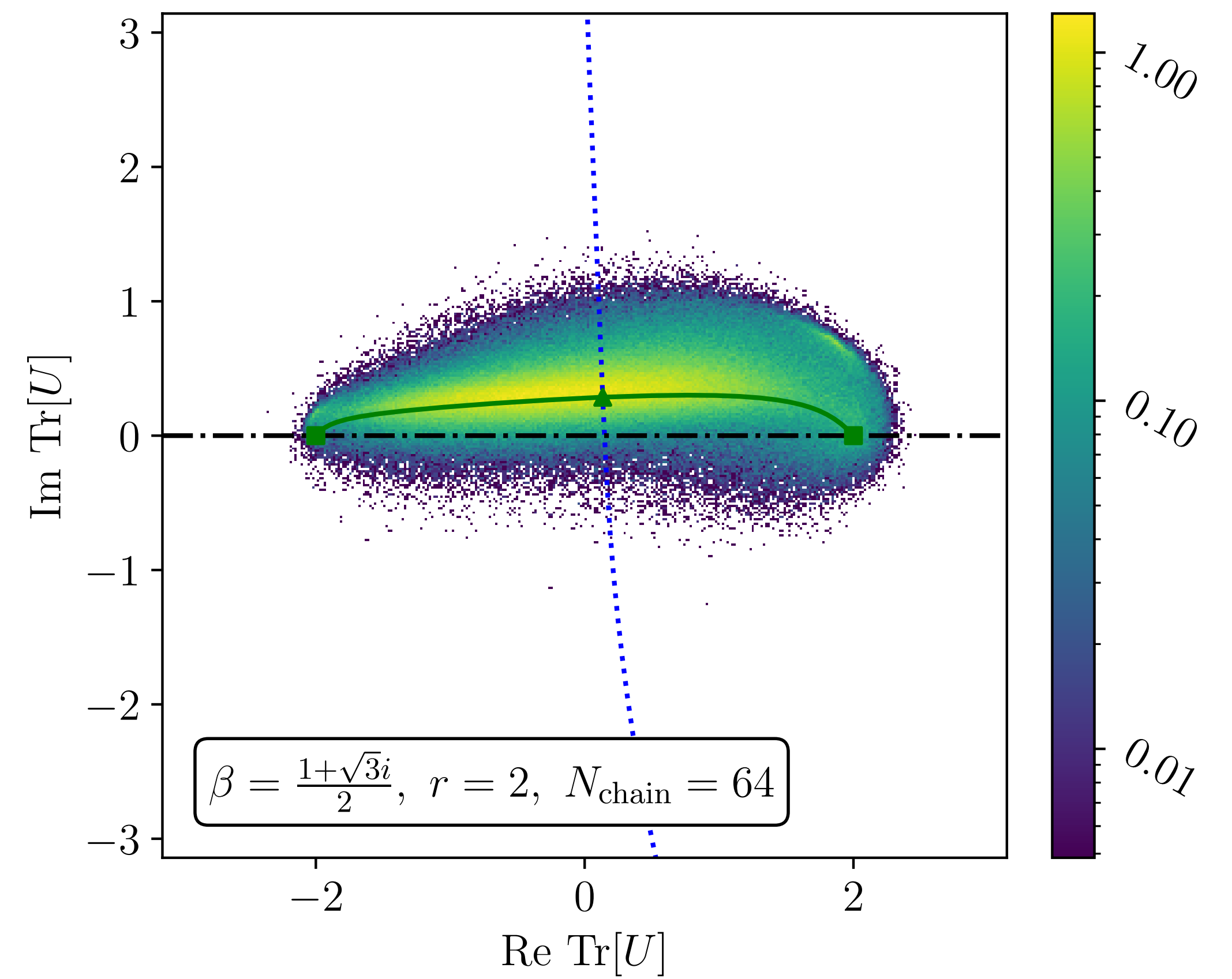
# Polyakov loop model (2/2)

A first step towards lattice gauge theories

Without regularization:



With regularization:



# Conclusion

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- Complex Langevin often fails due to the slow decay of the drift density
- Criterion of correctness is linked to the structure of the Lefschetz thimbles
- **We cure the wrong convergence issue by regularizing the weight function:**
  - Design regularizations to obtain a **compact thimble structure**
  - We obtain **corrections from apriori knowledge** using Dyson Schwinger equations

→ Solution to the complex cosine model and the Polyakov loop model  
→ Extension to lattice Yang-Mills theory is work in progress

**Goal: application to real-time Yang-Mills theory**

Thank you for your attention!

# Extensions to actual lattice gauge theory

Locality and extensivity of the weight function and regularization

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- Consider SU(N) Yang-Mills theory on an  $N_s^3 \times N_t$  lattice with the Wilson action

$$\rho = \exp(-S) = \prod_x e^{-\frac{1}{g^2} \sum_{\mu \neq \nu} \rho_{\mu\nu} \text{Tr}[U_{x,\mu\nu} - \mathbf{1}]} =: \prod_x \rho_x$$

- **'Global' regularization:**  $\rho_R = \rho + R \rightarrow$  global drift term, extensivity leads to problems

- **'Local' regularization:**  $\rho_R = \prod_x (\rho_x + R_x) \rightarrow$  correction procedure becomes complicated

## Ideas / work in progress:

- We can achieve desirable thimbles structures with **multiplicative regularizations** — essentially reweighting, but with respect to a complex weights (by design no hard overlap problem).
- We develop a mathematical connection between thimbles and CL that allows us to **design kernel transformation** that admit similar Lefschetz thimbles.