


Solution of the Thirring model in thimble regularization

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 (Received 8 September 2021; accepted 31 January 2022; published 1 March 2022)

Thimble regularization of lattice field theories has been proposed as a solution to the infamous sign problem. It is conceptually very clean and powerful, but it is in practice limited by a potentially very serious issue: in general many thimbles can contribute to the computation of the functional integrals. Semiclassical arguments would suggest that the fundamental thimble could be sufficient to get the correct answer, but this hypothesis has been proven not to hold true in general. A first example of this failure has been put forward in the context of the Thirring model: the dominant thimble approximation is valid only in given regions of the parameter space of the theory. Since then a complete solution of this (simple) model in thimble regularization has been missing. In this paper we show that a full solution (taking the continuum limit) is indeed possible. It is possible thanks to a method we recently proposed which de facto evades the need to simulate on many thimbles.

DOI: [10.1103/PhysRevD.105.054501](https://doi.org/10.1103/PhysRevD.105.054501)

I. INTRODUCTION

The lattice regularization of a quantum field theory enables access to nonperturbative aspects of the theory by numerical simulations. On the lattice physical quantities are defined as high-dimensional integrals which can be computed via importance sampling by interpreting the factor e^{-S} that appears in the integrands as a probability distribution. This technique has proven to be very effective to understand, for instance, the phenomenon of confinement in QCD. Unfortunately there are very interesting theories whose action S is complex, so that e^{-S} is not a well-defined probability distribution. This is the so-called sign problem and it affects for instance QCD at finite density. For this very reason the phase diagram of QCD remains largely unexplored by lattice simulations.

Not so long ago, following earlier work by Witten [1,2], it was proposed that one could evade the sign problem by regularizing a quantum field theory on Lefschetz thimbles [3,4]. The idea is simple. After complexifying the degrees of freedom one can define a set of manifolds attached to the critical (stationary) points of the theory. These manifolds are called Lefschetz thimbles. The Lefschetz thimbles are a basis for the original integration circle in the homological

sense, i.e., the original integrals can be decomposed to a linear combination of integrals over the thimbles. In other terms the thimble decomposition defines a convenient deformation of the original domain of integration (as a result the value of the integral does not change). It is a convenient deformation because on the thimbles the imaginary part of the action stays constant. Thus every contribution is free of the sign problem, apart from a residual phase coming from the orientation of the thimble in the embedding manifold. This gives rise to a residual sign problem, which is in practice found to be a (quite) milder one. Also, the coefficients appearing in the decomposition (the so-called intersection numbers) are integers and they can be zero, meaning that not all the thimbles do necessarily contribute.

Semiclassical arguments would suggest that the thimble attached to the critical point having the minimum real part of the action (also known as the fundamental thimble) gives the dominant contribution. This contribution is expected to be further enhanced in the continuum limit. Since the theory formulated on a single thimble has the same symmetries and the same perturbative expansion as the original theory, it was conjectured that the contribution coming from the fundamental thimble could be considered a good approximation for the complete theory. This conjecture is known as the single-thimble dominance hypothesis. Soon it was discovered that this hypothesis holds true in some cases but does not hold true in general. Various counterexamples have been found, such as the $(0+1)$ -dimensional QCD [5] and heavy-dense QCD [6], where the single-thimble approximation fails; the interested reader is referred to [7] for a nice discussion of the rich

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saddle points structure of the Hubbard model on the hexagonal lattice. To our knowledge, the first counterexample that has been discovered is the one-dimensional Thirring model. In Refs. [8–11] it was shown that taking into account the fundamental thimble alone is not enough to reproduce the correct results, not even in the continuum limit. Indeed how to address the failure of the single-thimble approximation for this theory has been an open question that we want to settle in this paper. There is little doubt that a convenient thimble regularization of the theory will work, but this is expected to take into account contributions from many thimbles and of course “How many?” is a key issue. We will show that we can indeed compute the solution of the theory by thimble regularization (and the continuum limit can be taken). Quite interestingly, this will be most effectively achieved in a way that to a large extent evades the subtleties of collecting contributions from many thimbles.

The problem of collecting the contributions from more than one thimble is nontrivial. The contributions can be individually estimated by importance sampling, but they must be properly weighted in the thimble decomposition. A universal and satisfactory way to obtain the weight is to date still missing. This was a major motivation for the exploration of alternative formulations somehow inspired by thimbles, e.g., the holomorphic flow [11,12] or various definitions of sign-optimized manifolds, possibly selected by deep-learning techniques [13–16]. Still, some proposals for multi-thimble simulations have been made in the literature [5,6,17,18]. In particular, in Ref. [6] we proposed a two-step process in which one first computes the weights in the semiclassical approximation and then computes the relevant corrections. This worked fairly well for the simple version of heavy-dense QCD we had considered. Nonetheless it turned out that this method does not work that well for the Thirring model. Therefore we turned back to the method we had thought of in Ref. [5], where the weights are obtained by using a few known observables as normalization points. We also applied the method we have proposed in Ref. [19] in which observables are reconstructed by merging via Padé approximants different Taylor series carried out around points where the single-thimble approximation is a good one. This last method proved to be more effective and it allowed to repeat the simulations towards the continuum limit.

The paper is organized as follows. In Sec. II we discuss the strategy that we have put in place to perform one-thimble simulations, in particular summarizing the algorithm we have adopted for the Monte Carlo integration. In Sec. III we report the numerical results we have obtained for the Thirring model from one-thimble simulations. Not surprisingly we observe the failure of the single-thimble approximations as it was already reported in Refs. [8–11]. In Sec. IV we show how we can address the issue by collecting the contributions from the subdominant

thimbles. The relative weight between the dominant and the subdominant thimbles is obtained by the method proposed in Ref. [5]. Finally in Sec. V we apply the strategy outlined in Ref. [19]. This strategy allowed us to carry out the study of the continuum limit.

II. MONTE CARLO INTEGRATION ON THIMBLES

The thimble decomposition for a given observable $\langle O \rangle$ can be stated as

$$\langle O \rangle = Z^{-1} \int dx e^{-S(x)} O(x), \quad (1a)$$

$$= \frac{\sum_{\sigma} n_{\sigma} e^{-iS_I(p_{\sigma})} \int_{\mathcal{J}_{\sigma}} dz e^{-S_R(z)} O(z) e^{i\omega(z)}}{\sum_{\sigma} n_{\sigma} e^{-iS_I(p_{\sigma})} \int_{\mathcal{J}_{\sigma}} dz e^{-S_R(z)} e^{i\omega(z)}}, \quad (1b)$$

$$= \frac{\sum_{\sigma} n_{\sigma} e^{-iS_I(p_{\sigma})} Z_{\sigma} \langle O e^{i\omega} \rangle_{\sigma}}{\sum_{\sigma} n_{\sigma} e^{-iS_I(p_{\sigma})} Z_{\sigma} \langle e^{i\omega} \rangle_{\sigma}}. \quad (1c)$$

Equation (1a) defines the physical quantity we want to calculate, where x is a short-hand notation for the fields configurations and $S(x) = S_R(x) + iS_I(x)$ is the complex-valued action of the system.

In Eq. (1b) the real degrees of freedom have been complexified, i.e., $x \mapsto z$. The integrals at the numerator and at the denominator have been rewritten as linear combinations of integrals over the stable thimbles \mathcal{J}_{σ} attached to the critical points p_{σ} [in this context we call critical points the stationary points of the complexified action, i.e., the points such that $\partial_z S(p_{\sigma}) = 0$]. The stable thimble attached to a given critical point p_{σ} is the union of the solutions of the steepest-ascent (SA) equations stemming from the critical point,

$$\frac{d}{dt} z_i = \frac{\partial \bar{S}}{\partial \bar{z}_i}, \quad z_i(-\infty) = p_{\sigma,i}. \quad (2)$$

Along each SA path the real part of the action is always increasing. On the other hand the imaginary part of the action stays constant, therefore the expressions $e^{-iS_I(p_{\sigma})}$ have been factorized in front of the integrals. The n_{σ} are integer coefficients known as intersection numbers. These count the number of intersections between the original integration contour and the unstable thimbles \mathcal{K}_{σ} , which are defined as the unions of the solutions of the steepest-descent equations leaving the critical point. Along each steepest-descent path the real part of the action is always decreasing. In Eq. (1b) a so-called residual phase $e^{i\omega(z)}$ appears in the integrals. This phase comes from the orientation of the thimble in the embedding manifold and it introduces a residual sign problem, though this is usually found to be a mild one.

In Eq. (1c) the thimble decomposition has been reformulated in a way that is amenable to numerical simulations. We have defined an expectation value on the thimble \mathcal{J}_{σ} ,

$$\langle f \rangle_\sigma = \frac{\int_{\mathcal{J}_\sigma} dz f e^{-S_R}}{\int_{\mathcal{J}_\sigma} dz e^{-S_R}} = \frac{\int_{\mathcal{J}_\sigma} dz f e^{-S_R}}{Z_\sigma}, \quad (3)$$

that we plan to evaluate stochastically. Notice that in order to make use of the thimble decomposition, one has to carry out two tasks. In addition to computing the thimble contributions $\langle f \rangle_\sigma$ one also has to calculate their associated weights Z_σ . Now we summarize the procedure we have put in place to numerically compute $\langle f \rangle_\sigma$. This is all that is needed in the single-thimble approximation, where one only takes into account the contribution coming from the fundamental thimble. Later on we will also discuss the issue of computing the weights in a generic thimble decomposition.

By solving the Takagi's problem for the Hessian of the action $H(S; z)$

$$H(S; p_\sigma) v^{(i)} = \lambda_i \bar{v}^{(i)},$$

one can find a set of Takagi vectors $v^{(i)}$ and their associated Takagi values λ_i . The Takagi vectors are a basis for the tangent space at the critical point. After having fixed a normalization \mathcal{R} , the direction associated to a given (infinitesimal) displacement from the critical point (a sort of initial condition for a given SA path) can be expressed as $\sum n_i v^{(i)}$, with $\hat{n} \in S_{\mathcal{R}}^{n-1}$, where $S_{\mathcal{R}}^{n-1}$ is the $(n-1)$ -dimensional hypersphere of radius \mathcal{R} . A point on the thimble can be singled out by the initial direction of the flow \hat{n} and by the integration time t ,

$$z \in \mathcal{J}_\sigma \leftrightarrow (\hat{n}, t) \in S_{\mathcal{R}}^{n-1} \times \mathbb{R}.$$

Let us first consider the denominator of Eq. (3), which we somewhat improperly refer to as a partition function. We can rewrite it in terms of the integration measure $\mathcal{D}\hat{n} = \prod_k dn_k \delta(|\hat{n}|^2 - \mathcal{R}^2)$,

$$\begin{aligned} Z_\sigma &= \int_{\mathcal{J}_\sigma} dz e^{-S_R(z)} = \int \mathcal{D}\hat{n} \int dt \Delta_{\hat{n}}^\sigma(\hat{n}, t) e^{-S_R(\hat{n}, t)} \\ &\equiv \int \mathcal{D}\hat{n} Z_{\hat{n}}^\sigma, \end{aligned}$$

where $\Delta_{\hat{n}}^\sigma(\hat{n}, t)$ is a leftover from the change of variables. An explicit expression for $\Delta_{\hat{n}}^\sigma(\hat{n}, t)$ was worked out in Ref. [20]. One finds the following expression for the *partial* partition function,

$$Z_{\hat{n}}^\sigma = 2 \left(\sum_i \lambda_i n_i^2 \right) \int dt e^{-S_{\text{eff}}(\hat{n}, t)}.$$

Notice that we have defined the effective action $S_{\text{eff}}(\hat{n}, t) = S_R(\hat{n}, t) - \log |\det V(\hat{n}, t)|$ from the real part of the action $S_R(\hat{n}, t)$ and the matrix $V(\hat{n}, t)$ having as columns the basis vectors of the tangent space at the time t . In order to

compute the partial partition function one has to parallel transport the basis vectors along the flow starting from the critical point, where a basis is known (the Takagi vectors). This requires integrating the parallel transport equations

$$\frac{dV_j^{(h)}}{dt} = \sum_i \bar{V}_i^{(h)} \overline{\partial_{z_i z_j}^2} S. \quad (4)$$

The *partial* partition function can be interpreted as the contribution to the partition function coming from an entire SA path. Similarly for the numerator one finds

$$\begin{aligned} \int_{\mathcal{J}_\sigma} dz f e^{-S_R(z)} &= \int \mathcal{D}\hat{n} f_{\hat{n}} \\ f_{\hat{n}} &= 2 \left(\sum_i \lambda_i n_i^2 \right) \int dt f(\hat{n}, t) e^{-S_{\text{eff}}(\hat{n}, t)}. \end{aligned}$$

All in all the expectation value $\langle f \rangle_\sigma$ becomes

$$\langle f \rangle_\sigma = \frac{\int \mathcal{D}\hat{n} f_{\hat{n}}}{Z_\sigma} = \int \mathcal{D}\hat{n} \frac{Z_{\hat{n}}^\sigma f_{\hat{n}}}{Z_\sigma Z_{\hat{n}}^\sigma}.$$

This expectation value can be computed by importance sampling, sampling entire SA paths $\propto \frac{Z_{\hat{n}}^\sigma}{Z_\sigma}$ and estimating the result from the sample mean $\frac{1}{N} \sum_{\hat{n}} \frac{f_{\hat{n}}}{Z_{\hat{n}}^\sigma}$. All in all, in the following we have to think of a SA (parametrized by a direction \hat{n}) as we think of a configuration in a standard Monte Carlo simulation. The algorithm proceeds in two steps.

- (1) First we make a Metropolis proposal starting from the previous *configuration* \hat{n} . The proposal is generated by making N consecutive rotations in planes defined by random directions. That is we pick two random integers $i \neq j$ and we perform a rotation in the plane singled out by the i th and the j th direction, i.e., we (propose an) update $(n_i, n_j) \mapsto (n'_i, n'_j)$ subject to the normalization condition. Then we pick another random integer $k \neq j$ and we perform a rotation in the plane singled out by the j th and the k th direction. We repeat until we have made N rotations. Each rotation is obtained by parametrizing (n_i, n_j) as

$$\begin{cases} n_i = \sqrt{C} \sin(\phi) \\ n_j = \sqrt{C} \cos(\phi) \end{cases},$$

and proposing

$$\begin{cases} n'_i = \sqrt{C} \sin(\phi + \phi_0) \\ n'_j = \sqrt{C} \cos(\phi + \phi_0) \end{cases},$$

where $C = n_i^2 + n_j^2$ and ϕ_0 has been uniformly extracted in $[-\alpha, \alpha]$.

- (2) Once we have proposed a new *configuration* \hat{n}' , we perform a Metropolis accept/reject test by accepting the proposal with probability $P_{\text{acc}}(\hat{n}' \leftarrow \hat{n}) = \min\left(1, \frac{Z_{\hat{n}'}}{Z_{\hat{n}}}\right)$. Since the Metropolis proposal is symmetric, this is enough to satisfy the detailed balance principle and the Markov chain will converge to the targeted probability distribution $\frac{Z_{\hat{n}'}}{Z_{\hat{n}}}$.

The key ingredients that we need to compute are the partial partition function $Z_{\hat{n}}$ and the (contribution from the current SA path to the) observable $f_{\hat{n}}$. These are time integrals whose computation requires to integrate the differential equations for both the fields and the basis vectors given in Eqs. (2) and (4) starting from an initial condition close to the critical point,

$$\begin{cases} z = z_{\sigma} + \sum_i n_i e^{\lambda_i t} v^{(i)} \\ V^{(h)} = v^{(h)} e^{\lambda_h t} \end{cases}.$$

Actually in our calculations we integrate in action instead of integrating in time. Since the real part of the action is monotonic in time, one can make the change of variable

$$\frac{dS_R}{dt} = \frac{1}{2} \frac{d}{dt} (S + \bar{S}) = |\nabla S|^2 \mapsto dt = dS_R |\nabla S|^{-2} = ds |\nabla S|^{-2}.$$

In the last step we have also defined a second change of variable $s = S_R - S_R(z_{\sigma})$. In terms of s , the differential equations for the fields and the basis become

$$\begin{aligned} \frac{dz_i}{ds} &= |\nabla S|^{-2} \frac{\partial \bar{S}}{\partial \bar{z}_i}, \\ \frac{dV_j^{(h)}}{ds} &= |\nabla S|^{-2} \sum_i \bar{V}_i^{(h)} \overline{\partial_{z_i z_j}^2 S}. \end{aligned}$$

The change of variable is also performed for the time integrals defining $Z_{\hat{n}}$ and $f_{\hat{n}}$, yielding

$$\begin{aligned} Z_{\hat{n}} &= 2 \sum_i \lambda_i n_i^2 e^{-S_R(z_{\sigma})} \int_0^{\infty} ds |\nabla S|^{-2} e^{-s + \log |\det V(s)|}, \\ f_{\hat{n}} &= 2 \sum_i \lambda_i n_i^2 e^{-S_R(z_{\sigma})} \int_0^{\infty} ds f |\nabla S|^{-2} e^{-s + \log |\det V(s)|}. \end{aligned} \quad (5)$$

The advantage is twofold. First, the integration in action has the effect of decreasing the number of iterations required to reach convergence. Second, one can immediately recognize from Eq. (5) that the integrals can be calculated using the Gauss-Laguerre quadrature, i.e.,

$$\int_0^{\infty} f(x) e^{-x} dx = \sum w_i f(x_i),$$

where $\{x_i\}$ and $\{w_i\}$ are the quadrature points and their associated weights. The calculation of the determinant (which is computationally quite expensive) is required only at the quadrature points.

III. ONE-THIMBLE SIMULATIONS

We now discuss the thimble regularization of the one-dimensional Thirring model. As we have remarked in the introduction, historically this is one of the very first examples that have shown the inadequacy of the single-thimble approximation (see Refs. [8–11]). The lattice action for this theory can be written down as

$$S = \beta \sum_{n=1 \dots L} (1 - \cos(\phi_n)) - \log \det D,$$

where $\det D = \frac{1}{2^{L-1}} (\cosh(L\hat{\mu} + i \sum_n \phi_n) + \cosh(L \operatorname{asinh}(\hat{m})))$ is the fermionic determinant. The parameters $\hat{\mu} = \mu a$ and $\hat{m} = m a$ are, respectively, the chemical potential and the fermion mass in lattice units, $\beta = (2g^2 a)^{-1}$ is the inverse coupling constant and ϕ_n is a scalar field discretized on a one-dimensional lattice of length L . The theory features a sign problem originating from the fermionic determinant, which is complex at finite $\hat{\mu}$.

An analytical solution is known for the partition function. This is given in term of the modified Bessel functions of the first kind $I_n(x)$,

$$Z = \frac{1}{2^{L-1}} e^{-L\beta} [I_1(\beta)^L \cosh(L\hat{\mu}) + I_0(\beta)^L \cosh(L \operatorname{asinh}(\hat{m}))].$$

From the partition function one can derive closed-form expressions for the physical observables, such the scalar condensate $\langle \bar{\chi} \chi \rangle$ and the fermion density $\langle n \rangle$,

$$\begin{aligned} \langle \bar{\chi} \chi \rangle &= \frac{1}{L} \frac{\partial \log Z}{\partial \hat{m}} = \frac{1}{\cosh(\operatorname{asinh}(\hat{m}))} \frac{I_0(\beta)^L \sinh(L \operatorname{asinh}(\hat{m}))}{I_1(\beta)^L \cosh(L\hat{\mu}) + I_0(\beta)^L \cosh(L \operatorname{asinh}(\hat{m}))} \\ \langle n \rangle &= \frac{1}{L} \frac{\partial \log Z}{\partial \hat{\mu}} = \frac{I_1(\beta)^L \sinh(L\hat{\mu})}{I_1(\beta)^L \cosh(L\hat{\mu}) + I_0(\beta)^L \cosh(L \operatorname{asinh}(\hat{m}))} \end{aligned}$$

A solution by numerical methods, on the other hand, is difficult to obtain because of the sign problem. In this paper we explore the feasibility of using the thimble regularization method to study the Thirring model. The first step consists in complexifying the degrees of freedom. In this case, each real degree of freedom ϕ_n is replaced by a complex degree of freedom z_n . The action is now given in terms of z_n ,

$$\beta \sum_{n=1 \dots L} (1 - \cos(z_n)) - \log \det D,$$

where $\det D = \frac{1}{2^{L-1}} (\cosh(L\hat{\mu} + i \sum_n z_n) + \cosh(L \operatorname{asinh}(\hat{m})))$. The critical points of the theory are found by requiring a vanishing gradient,

$$\begin{aligned} \frac{\partial S}{\partial z_n} &= \beta \sin(z_n) \\ &- i \frac{\sinh(L\hat{\mu} + i \sum_i z_i)}{\cosh(L\hat{\mu} + i \sum_i z_i) + \cosh(L \operatorname{asinh}(\hat{m}))} = 0. \end{aligned} \quad (6)$$

From this condition one can see that $\sin(z_n)$ takes for all $n = 1 \dots L$ always the same value, which we denote by $\sin(z)^1$ and which depends on z_n only through the sum $\sum_n z_n$. Therefore the critical points are given by field configurations where $z_i = z$ for any i but a number n_- of lattice points where z_i can take the value $\pi - z$ [without changing $\sin(z_n)$]. For a fixed n_- the values admitted for z are found by numerically solving

$$\sin(z) = \frac{i}{\beta} \frac{\sinh(L\hat{\mu} + i(L - 2n_-)z + in_- \pi)}{\cosh(L\hat{\mu} + i(L - 2n_-)z + in_- \pi) + \cosh(L \operatorname{asinh}(\hat{m}))}. \quad (7)$$

This equation follows directly from Eq. (6). For instance let us consider the critical points in the $n_- = 0$ sector, which are expected to give the leading contributions [9]. The solutions corresponding to the parameters $L = 4$, $\beta = 1$ and $ma = 1$ are graphically shown in Fig. 1. The top left figure shows the solutions for z of Eq. (7), while the top right figure shows how they move when we add a finite chemical potential.

Notice that only the left complex half-plane is shown. Since Eq. (7) is invariant under $z \mapsto -\bar{z}$, if z defines a critical point so does $-\bar{z}$. Therefore each critical point σ_i has a counterpart σ_{-i} in the right complex half-plane. However these mirrored critical points do not give rise to independent contributions. Indeed the action displays a symmetry $S(-\bar{z}) = \overline{S(z)}$ which ensures that the thimble contributions from the member of each pair σ_i, σ_{-i} are conjugate contributions.

If we look at the bottom left picture of Fig. 1 then we can see that the fundamental thimble, the one attached to the critical point having the minimum (real part of the) action, is \mathcal{J}_{σ_0} . Actually from some chemical potential μ_0 onwards the critical point $\sigma_{\bar{1}}$ has an even lower (real part of the) action, but since this is also lower than the minimum real part of the action on the original domain, the thimble attached to this critical point cannot appear in the thimble decomposition.

Now we want to compute the contribution to a generic observable coming from the fundamental thimble \mathcal{J}_{σ_0} . Let us summarize how the algorithm illustrated in Sec. II applies to the specific case of the Thirring model.

- (i) For a lattice of arbitrary length L the (complexified) theory has L complex degrees of freedom. The fundamental thimble is the union of the solutions of the SA equations

$$\frac{d}{dt} z_i = \beta \sin(z_n) - i \frac{\sinh(L\hat{\mu} + i \sum_i z_i)}{\cosh(L\hat{\mu} + i \sum_i z_i) + \cosh(L \operatorname{asinh}(\hat{m}))}, \quad z_i(-\infty) = \sigma_0, \quad (8)$$

where z_i is the value of the field at the i th site of the lattice and the asymptotic initial condition is the uniform field configuration $z_i = \sigma_0$ (i.e., the critical point). The thimble is a manifold of real dimension L embedded in \mathbb{C}^L and the (local) tangent space is spanned by L basis vectors. A basis is known at the critical point. This is the set of the Takagi vectors. The Takagi vectors are found by solving the Takagi problem $H(z = \sigma_0)v^{(i)} = \lambda_i \bar{v}^{(i)}$, where $H(z = \sigma_0)$ is the

Hessian of the action at the critical point. The Hessian of the action for the Thirring model is

$$\begin{aligned} H_{ij}(z) &= \frac{\partial^2 S}{\partial z_i \partial z_j} = \beta \cos(z_i) \delta_{i,j} \\ &+ \frac{\cosh(L\hat{\mu} + i \sum_n z_n)}{\cosh(L\hat{\mu} + i \sum_n z_n) + \cosh(L \operatorname{asinh}(\hat{m}))} \\ &- \frac{\sinh^2(L\hat{\mu} + i \sum_n z_n)}{(\cosh(L\hat{\mu} + i \sum_n z_n) + \cosh(L \operatorname{asinh}(\hat{m})))^2}. \end{aligned} \quad (9)$$

¹Here and in the following we adhere to the notation of [8].

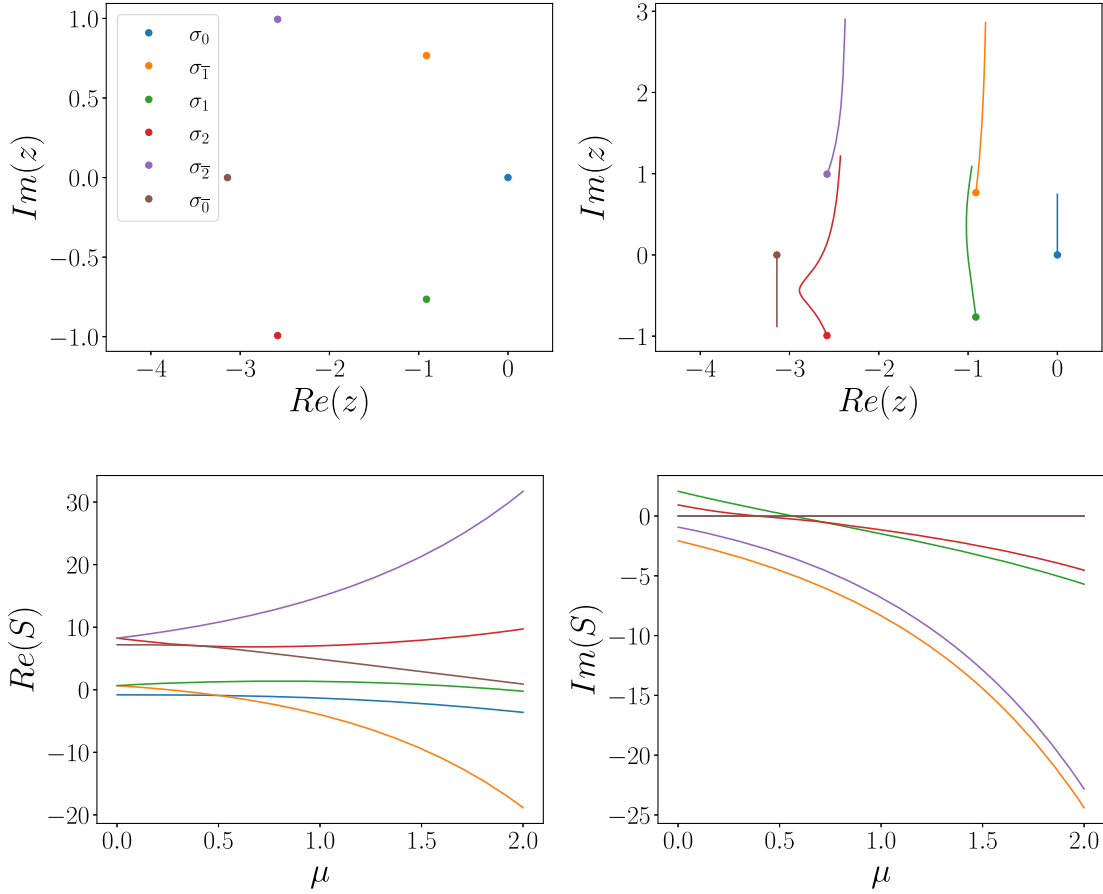


FIG. 1. Critical points for $L = 4, \beta = 1$ and $ma = 1$: solutions for $\hat{\mu} = 0$ (top left), solutions for $\hat{\mu} \in [0.0, 2.0]$ (top right), real part of the action as a function of $\hat{\mu}$ (bottom left) and imaginary part of the action as a function of $\hat{\mu}$ (bottom right).

The Takagi problem is solved numerically (only once, at the beginning of the simulation) and the solution returns L Takagi vectors $v^{(i)}$ and the associated Takagi values λ_i .

- (ii) Our Monte Carlo method works by sampling entire SA paths. Each path is identified by the initial direction of the flow \hat{n} along the tangent space at the critical point. For the one-dimensional Thirring model the vector \hat{n} has L components which denote the initial displacement along each Takagi vector. Specifically we apply the Metropolis-Hastings algorithm to sample paths $\propto Z_{\hat{n}}$. Starting from a path with initial direction \hat{n} , we propose a new path with initial direction \hat{n} using a set of rotations as described in Sec. II. Then we apply the Metropolis acceptance step, which requires the calculation of the partial partition function $Z_{\hat{n}}$, and we measure the observable, which in our case means calculating the quantity $f_{\hat{n}}$. The thimble contribution to the observable f is given by the sample mean $\langle f \rangle_{\sigma_0} = \frac{1}{N} \sum_{\hat{n}} \frac{f_{\hat{n}}}{Z_{\hat{n}}}$. The quantities $Z_{\hat{n}}$ and $f_{\hat{n}}$ are integrals in time or (after a change of variable) in action. The integrals depend on the integration variable implicitly through the field and basis configurations. The latter evolve

following, respectively, the SA equations [Eq. (8)] and the parallel transport equations [Eq. (4), with the Hessian from Eq. (9)]. The SA and parallel transport equations are integrated numerically starting from an initial condition dependent on the initial direction of the path \hat{n} :

$$\begin{cases} z = z_{\sigma} + \sum_i n_i e^{\lambda_i t} v^{(i)} \\ V^{(h)} = v^{(h)} e^{\lambda_h t} \end{cases} .$$

The very same algorithm will be used both in Sec. V to sample (again) the fundamental thimble and in Sec. IV to sample both the fundamental and the subleading thimbles.

In Fig. 2 we show the numerical results obtained from numerical simulations performed on the fundamental thimble \mathcal{J}_{σ_0} for different values of $\beta = 1.0, 1.5, 2.0, 4.0$.² At strong couplings (i.e., at low β) the single-thimble approximation yields the wrong results, at least for high

²Actually a small imaginary part has been added to β in order to prevent a Stokes phenomenon between \mathcal{J}_{σ_0} and $\mathcal{J}_{\sigma_{\bar{0}}}$.

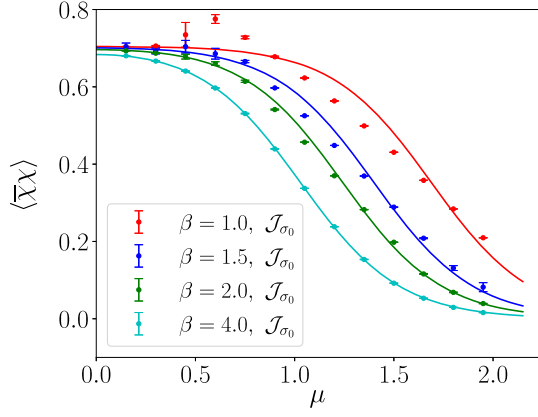


FIG. 2. Scalar condensate for $L = 4$, $\beta = 1.0, 1.5, 2.0, 4.0$ and $ma = 1$: results from one-thimble simulations on \mathcal{J}_{σ_0} .

chemical potentials. This does not come as a surprise (it is exactly what other authors found previously) and shows that the contribution from the subdominant thimbles cannot be neglected.

IV. MULTITHIMBLE SIMULATIONS

The reason why the single-thimble approximation fails is that, when the chemical potential is increased starting from zero, different Stokes phenomena take place and the thimble decomposition changes. As a result thimbles other than the fundamental one need to be taken into account at high chemical potentials, even though at zero chemical potential the contribution from the fundamental thimble \mathcal{J}_{σ_0} is the only non-negligible one.

All in all the subdominant contribution that one has to take into account is the one from the thimble \mathcal{J}_{σ_1} , which enters the decomposition at $\hat{\mu} \approx 0.56$. Indeed at this chemical potential the imaginary parts of the action at σ_0 and σ_1 are the same, as shown in the bottom right picture of Fig. 1. This is a necessary condition for a Stokes phenomenon, which indeed happens. For a very nice and thorough analysis of the Stokes phenomena and their consequences on the thimble decomposition, we refer the reader to Ref. [9].

In order to properly collect the contributions from the fundamental thimble \mathcal{J}_{σ_0} and the subdominant thimble \mathcal{J}_{σ_1} , we have to determine the relative weights of the two contributions. The approach we took is the one we have followed for $(0+1)$ -dimensional QCD. Since we are considering only two independent thimble contributions, the expectation value of a generic observable O can be written as

$$\langle O \rangle = \frac{n_0 e^{-iS_I(z_0)} Z_0 \langle O e^{i\omega_0} \rangle_0 + n_{12} e^{-iS_I(z_{12})} Z_{12} \langle O e^{i\omega_{12}} \rangle_{12}}{n_0 e^{-iS_I(z_0)} Z_0 \langle O e^{i\omega_0} \rangle_0 + n_{12} e^{-iS_I(z_{12})} Z_{12} \langle O e^{i\omega_{12}} \rangle_{12}}.$$

Here we use the subscript 12 to denote quantities that refer to the critical points σ_1 and σ_{-1} . As we have already

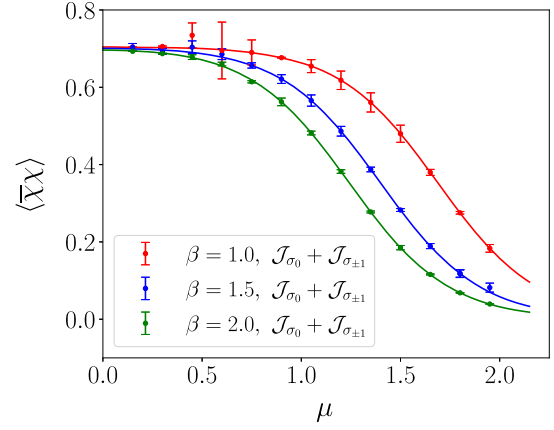


FIG. 3. Scalar condensate for $L = 4$, $\beta = 1.0, 1.5, 2.0$ and $ma = 1$: results from multithimble simulations on \mathcal{J}_{σ_0} and $\mathcal{J}_{\sigma_{\pm 1}}$.

observed these critical points give rise to conjugate contributions (whose sum is purely real). When \mathcal{J}_{σ_1} enters the thimble decomposition, so does $\mathcal{J}_{\sigma_{-1}}$, but we have only one independent contribution. Now if we divide both the numerator and the denominator by $n_0 e^{-iS_I(z_0)} Z_0$ we obtain

$$\langle O \rangle = \frac{\langle O e^{i\omega_0} \rangle_0 + \alpha \langle O e^{i\omega_{12}} \rangle_{12}}{\langle e^{i\omega_0} \rangle_0 + \alpha \langle e^{i\omega_{12}} \rangle_{12}},$$

where $\alpha = \frac{n_{12} e^{-iS_I(z_{12})} Z_{12}}{n_0 e^{-iS_I(z_0)} Z_0}$. Since α only depends on the thimble structure of the theory, we can determine it by taking some observable \tilde{O} as a normalization point and then use such value to calculate any other observable.

For the Thirring model we fixed α from the (analytical solution of the) number density and we used it to calculate the scalar condensate. The numerical results are shown in Fig. 3. The results are now in agreement with the analytical solution: the contribution from the subdominant thimble fully accounts for the discrepancies observed in the results from one-thimble simulations (and that is why we could make a long story short earlier, when we said that the subdominant contribution that one has to take into account is the one from the thimble \mathcal{J}_{σ_1}). Notice that the statistical errors are quite large for $\hat{\mu} \approx 0.6 \div 0.75$, this is in part due to cancellations in the calculation of α and in part due to numerical difficulties in sampling the nondominant thimble. The partial partition function (i.e., the probability distribution for importance sampling) shows sharp spikes in some regions of n_0 (i.e., the initial direction of the SA path on the tangent space along the Takagi vector having the largest Takagi value). Within these regions the partial partition function varies by several order of magnitude and this makes it difficult to keep a good acceptance ratio. Moreover for \mathcal{J}_{σ_1} the regions are also so thin that the regions of interest cannot be represented in double precision. Quadruple precision is needed in the simulations, with a noticeable impact on the performance of the code.

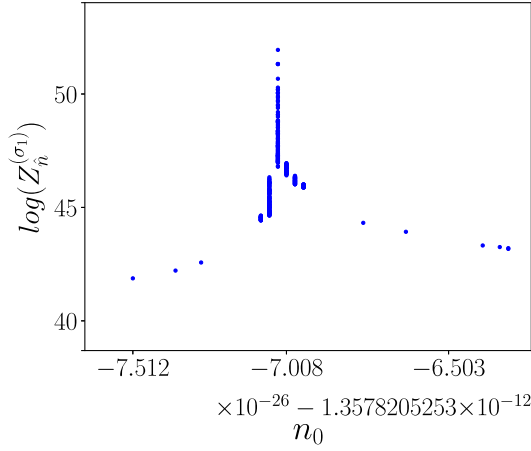


FIG. 4. Logarithm of the partial partition function for the critical point σ_1 . This is plotted as a function of n_0 , i.e., the initial direction of the SA path on the tangent space along the Takagi vector having the largest Takagi value. Parameters: $L = 2$, $\beta = 1$ and $ma = 1$.

An example of this last issue is shown in Fig. 4, where the logarithm of the partial partition function of \mathcal{J}_{σ_1} is shown as a function of n_0 for a $L = 2$ lattice.

In the next section we will study the Thirring model using a strategy that will turn out to be much more effective, since (1) it does not need to take a known result as a normalization point and (2) it does not require to sample the subdominant thimble.

V. TAYLOR EXPANSIONS ON THE FUNDAMENTAL THIMBLE

In this section we follow the approach we proposed in Ref. [19] (the interested reader is referred to it for further details on the method itself). The main idea is that we can bypass the need for multithimble simulations by calculating multiple Taylor expansions around points where the single-thimble approximation holds true. As a consequence, the coefficients of such expansions can be computed by one-thimble simulations. The method relies on the fact that while the thimble decomposition can be (highly) discontinuous as we sample different regions in the parameter space of the theory, physical observables (in general) are not. Our strategy is to take advantage of the single-thimble approximation holding true in given regions and bridge these different (disjoint) regions by Taylor expansions. Actually it turns out that the most efficient way to bridge these different regions is by Padé approximants.

Starting from a few expansion points $\frac{\mu}{m}^{(k)}$ where the single-thimble approximation holds we calculate the Taylor coefficients of the observables, $c_j^{(k)} = \frac{1}{j!} (\partial_{(\frac{\mu}{m})^j}^j \langle O \rangle) (\frac{\mu}{m}^{(k)})$, by one-thimble simulations. Then we look for a rational interpolant of the form

$$P_{N,M} \left(\frac{\mu}{m} \right) = \frac{a_0 + a_1 \left(\frac{\mu}{m} \right) + \dots + a_N \left(\frac{\mu}{m} \right)^N}{1 + b_1 \left(\frac{\mu}{m} \right) + \dots + b_M \left(\frac{\mu}{m} \right)^M},$$

and we find a_i, b_i by imposing that

$$\frac{1}{j!} \left(\partial_{(\frac{\mu}{m})^j}^j P_{N,M} \right) \left(\frac{\mu}{m}^{(k)} \right) = c_j^{(k)} \quad \text{for } k = 1 \dots K, j = 0 \dots N_k.$$

We obtain a nonlinear system of $N + M + 1 = \sum_{k=1 \dots K} (1 + N_k)$ equations with $N + M + 1$ unknowns that can be solved, for instance, by a symbolic manipulation program.

As a side effect, having computed Padé approximants, we are able to probe the analytical structure of the observables, i.e., we can locate their singularities. This makes the approach a very powerful tool for theoretical investigations, with applications beyond thimble regularization itself. In a more general framework, one could say that bridging different regions by Padé approximants can be an effective way of studying the phase diagram of a theory for which direct computations can be approached only in given regions of the parameter space. Indeed such a strategy can be e.g., applied to lattice QCD at imaginary chemical potential [21,22].

In Ref. [19] the viability of this approach was tested with exploratory simulations: a simple version of heavy-dense QCD and the Thirring model were studied on very small lattices. Here we improve upon those results by studying the Thirring model on larger lattices towards the continuum limit.

From a numerical point of view the method of [19] proved to be quite effective in our case. It allowed to study the Thirring model for (much) larger/finer lattices than the (modest) $L = 4$ lattice we have considered in the previous sections.

Let us start by studying the theory using $L = 8$, $\beta = 1$ and $ma = 2$ as parameters. We need a few expansion points where the Taylor expansion can be calculated by one-thimble simulations:

- (1) As a first point we selected $\frac{\mu}{m} = 0.4$. This choice can be understood from a simple argument. The range of S_I on the real domain of integration is limited. As a result, from the explicit computation of $S_I^\sigma(\frac{\mu}{m})$ we can conclude that below a given value $\frac{\mu}{m}$ of the chemical potential there are only two unstable thimbles that can intersect the real domain of integration. These are the one attached to the fundamental critical point σ_0 and the one attached to the critical point $\sigma_{\bar{0}}$. But the contribution from $\mathcal{J}_{\sigma_{\bar{0}}}$ can be neglected, as $S_R(\sigma_{\bar{0}}) \gg S_R(\sigma_0)$.
- (2) As a second point we selected $\frac{\mu}{m} = 1.4$. For this value of the chemical potential, all but three of the critical points other than the fundamental one have $S_R(\sigma) \gg S_R(\sigma_0)$. Hence we can neglect them. We denote the three remaining critical points by $\sigma_1, \sigma_{\bar{1}}$

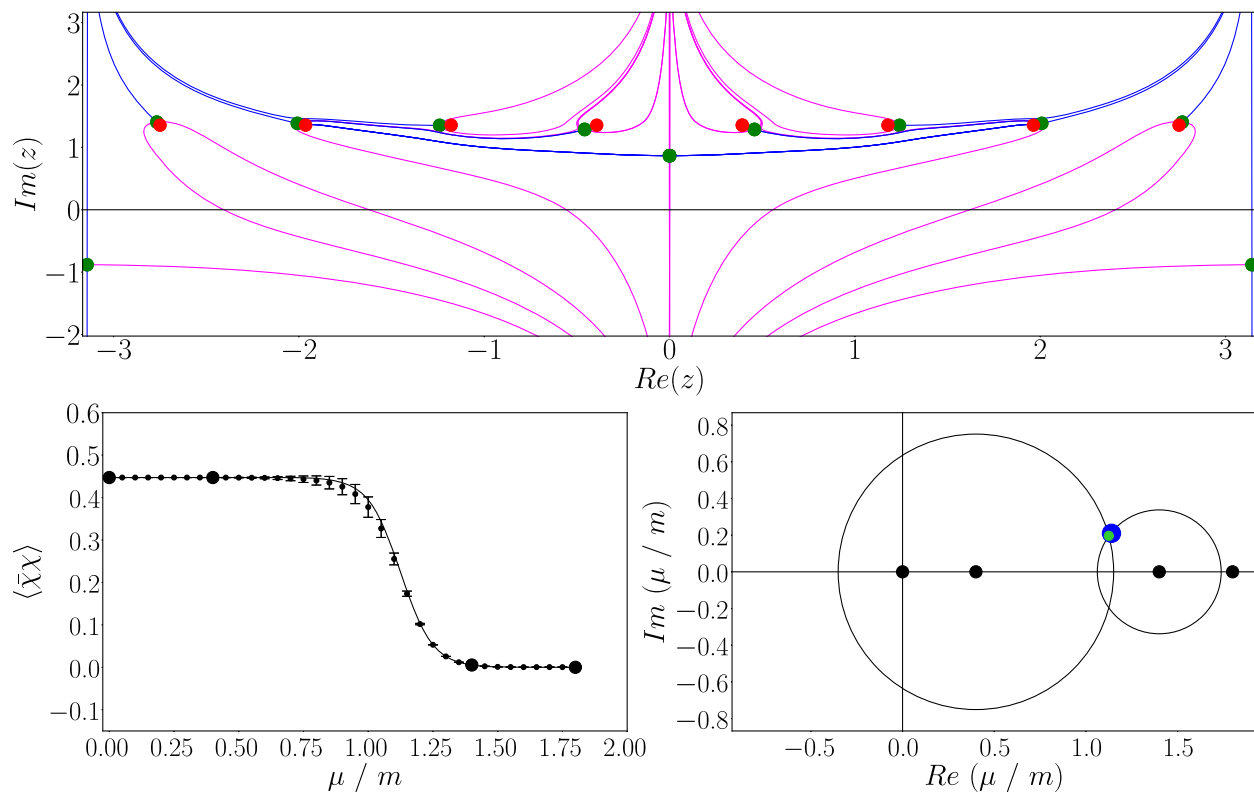


FIG. 5. The top picture shows the thimble structure for $L = 8$, $\beta = 1.0$ and $ma = 2$ at $\frac{\mu}{m} = 1.4$. The critical points are represented by the green points, while the stable and unstable thimbles are displayed in blue and magenta. The critical point σ_0 is the one sitting at $Re(z) = 0$ and the critical point immediately on the left is σ_1 . The unstable thimble attached to the former intersects the original domain of integration (the real axis), while the unstable thimble attached to the latter does not. The bottom left picture shows the results from Padé as black error bars, which are in very good agreement with the expectations from the analytical solution (represented by the black solid line). The expansion points are also shown as black points. In the bottom right picture the expansion points are displayed on the complex $\frac{\mu}{m}$ plane. On top of these are also shown the singularity of the condensate (the green point) and the stable pole of the Padé approximant (the blue point).

and σ_2 . Two of them (namely σ_1 and σ_2) have a real part of the action S_R less than the minimum S_R^{\min} of the real action on the original domain of integration. Hence their unstable thimble cannot intersect the original domain of integration. As for σ_1 one can explicitly check that the attached unstable thimble does not intersect the original domain of integration. See the top picture of Fig. 5. The critical point σ_0 is represented by the green point sitting at $Re(z) = 0$. The critical point σ_1 is represented by the closest green point to σ_0 to the left. The unstable thimbles are displayed in magenta.

- (3) The very same reasoning applied to $\frac{\mu}{m} = 0.4$ and $\frac{\mu}{m} = 1.4$ can be applied to $\frac{\mu}{m} = 0$ and $\frac{\mu}{m} = 1.8$ (actually at $\frac{\mu}{m} = 0$ there is no sign problem and thimble regularization is not even needed).

We have computed by one-thimble simulations the Taylor coefficients for the scalar condensate at $\frac{\mu}{m} = 0.4$ and $\frac{\mu}{m} = 1.4$, respectively, up to orders 2 and 5. Then we have constructed a (multipoint) Padé approximation using these

coefficients as inputs, adding as extra constraints the coefficients of order 0 at the boundaries of the region we have considered, i.e., $\frac{\mu}{m} = 0$ and $\frac{\mu}{m} = 1.8$. These extra constraints were also calculated by one-thimble simulations.

The results are shown in the bottom left picture of Fig. 5. The expansion points are displayed as black points. The numerical results from the Padé approximants are displayed in black (with error bars): they are in good agreement with the analytical solution (the black line). The bottom right picture of Fig. 5 shows the expansion points (the black points) on the complex $\frac{\mu}{m}$ plane. The picture also shows the pole of the approximant (the blue point) and the true singularity of the observable (the green point). The first matches quite well with the latter.

Finally the simulations have been repeated towards the continuum limit. For this theory the continuum limit is reached by increasing $L = \frac{1}{T a}$ and $\beta = \frac{1}{2g^2 a}$ while keeping fixed the dimensionless products $L\hat{m}$ and $\beta\hat{m}$. In particular we kept constant $L\hat{m} = 16$ and $\beta\hat{m} = 2$. The parameters used in the simulations are summarized in Table I.

TABLE I. Parameters used for the continuum limit analysis ($L\hat{m} = 16, \beta\hat{m} = 2$).

L	β	ma
8	1.0	2.00
16	2.0	1.00
32	4.0	0.50
64	8.0	0.25

For the finer lattices we proceeded as we did for the $L = 8$ lattice. We selected two suitable expansion points and we calculated the Taylor coefficients up to order 2 and 5 by one-thimble simulations. As extra constraints we also calculated the coefficients of order 0 at the boundaries of the $\hat{\mu}$ range. These data were used as inputs to construct the Padé approximants. For the $L = 32, 64$ lattices the statistical error on the fifth order Taylor coefficient was quite large and this resulted in a large indetermination on the Padé approximant itself. Fortunately in building our (multi-point) Padé approximants we have two different handles

that we can make use of: one handle is the order of the Taylor expansions, the second one is the number of expansion points. For the $L = 32, 64$ lattices we decided to use an additional extra constraint in the low $\hat{\mu}$ region in place of the fifth order Taylor coefficient.

The numerical results are shown in Fig. 6. The bottom left and bottom right pictures show how the Padé approximants (the colored error bars) converge to the analytical solution (the red line) as we gradually increase the order of the Taylor coefficients calculated at the two (central) expansion points. Specifically these pictures illustrate what happens in the two different cases ($L = 16$ and $L = 64$) where, respectively, two and three extra constraints were used and the highest order that has been calculated in the Taylor expansion was, respectively, 5 and 4.

The top panel of Fig. 6 summarizes the results we have obtained for all the lattices. Different colors denote different lattices. The analytical solutions are drawn as colored solid lines. The results from the simulations are in good agreement with the analytical solutions, and the statistical errors are well under control up to $L = 64$.

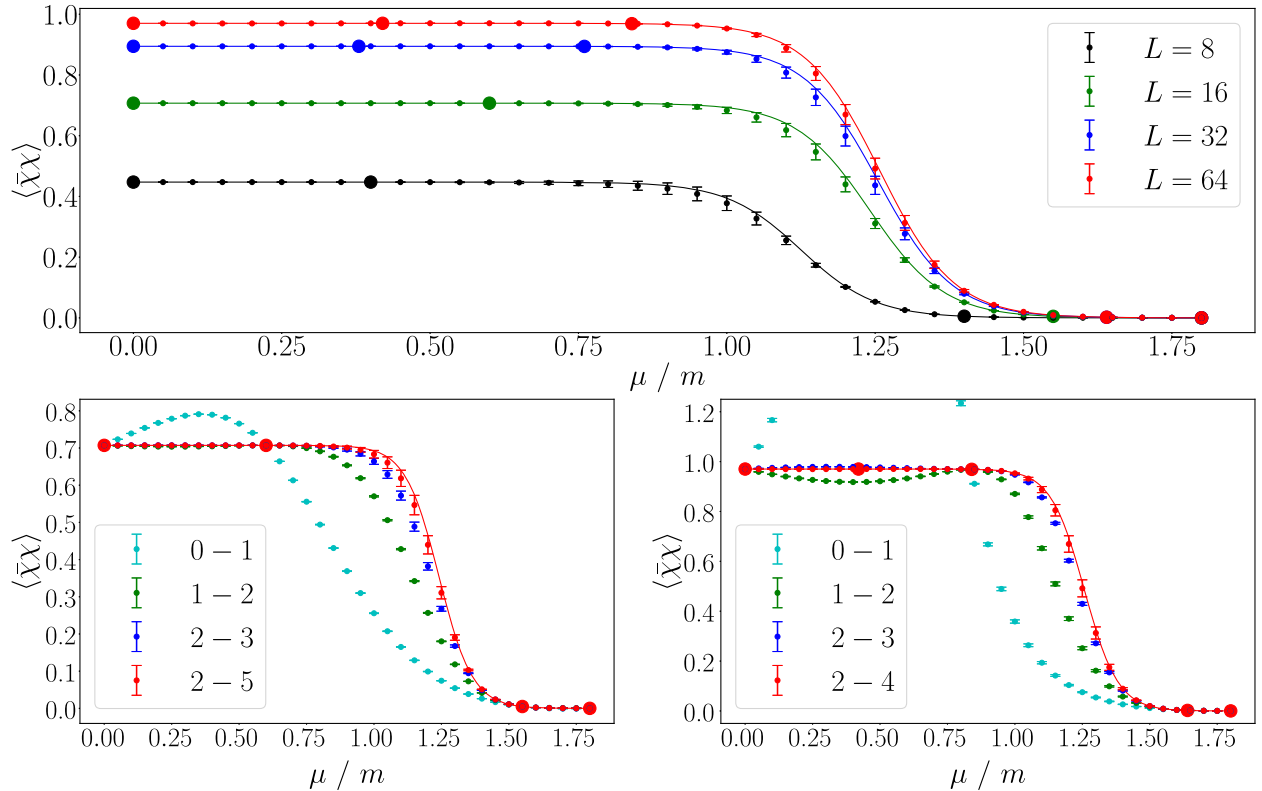


FIG. 6. Results from the continuum limit analysis ($L\hat{m} = 16, \beta\hat{m} = 2$). The bottom left and bottom right pictures show how the Padé approximants converge to the correct solution for the $L = 16$ and $L = 64$ lattices. The expansion points are shown as red points. Different colors are used to denote the Padé approximants obtained by using a gradually increasing order of the Taylor coefficients for the two central expansion points. Respectively, two and three extra constraints on the zeroth order Taylor coefficients were used for the two lattices and the highest order Taylor coefficient that was calculated is, respectively, 5 and 4. The top picture summarizes the results we obtained in our analysis. Different colors correspond to different lattice sizes. The analytical solutions are denoted by the colored solid lines.

VI. CONCLUSIONS

The Thirring model has been extensively studied as a playground to test our ability to tackle finite-density theories plagued by a sign problem. This work aimed at settling an old story: is the thimble approach really failing for the (supposedly simple) Thirring model? Thimble regularization of lattice field theories is a conceptually nice solution to the sign problem, but it can be strongly limited by the need for multithimble simulations. The Thirring model has indeed been a first example of the failure of the simplest application of the thimble approach, i.e., the one based on simulations on the dominant thimble alone. While there was little doubt of the conceptual solution to this failure (other thimbles provide an important contribution), an explicit proof of this has been till now missing. We showed that by keeping into account more contributions (on top of the dominant thimble) the (known) analytical solution can indeed be reconstructed. While this is conceptually clean, it is from a numerical point of view quite cumbersome. As a result, the computations we reported on were restricted to a system of modest size. There is nevertheless a more powerful method to achieve the result we were interested in, which in the end avoids multithimble simulations. We showed that we could successfully take the continuum limit in the computation of the Thirring model making use of the recently introduced method of computing Taylor expansions on thimbles.

After calculating multiple Taylor expansions around points where the single-thimble approximation holds true, we could bridge these different (disjoint) regions by computing (multipoint) Padé approximants. The latter also gave us access to the singularity structure of the theory. While this settles the old story of the Thirring model in the thimble approach, at the same time suggests that a similar strategy can be successfully applied to problems beyond thimbles. Bridging different regions by Padé approximants can be an effective way of studying the phase diagram of a theory for which direct computations can be approached only in given regions of the parameter space.

The data presented in the figures of this paper can be found in Ref. [23].

ACKNOWLEDGMENTS

This work has received funding from the European Unions Horizon 2020 research and innovation programme under the Marie Skłodowska-Curie Grant Agreement No. 813942 (EuroPLEx). We also acknowledge support from INFN under the research project *i.s. QCDLAT*. The numerical work for this research has made use of the resources available to us under the INFN-CINECA agreement. It also benefits from the HPC (High Performance Computing) facility of the University of Parma, Italy.

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