Spectral functions via numerical analytic continuation

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EMMI Workshop - Functional Methods in Strongly Correlated Systems

Hirschegg, Kleinwalsertal, Austria, March 31 - April 6, 2019









Schlessinger Point Method (SPM)

definition and simple examples

Analytic continuation of Euclidean data

- test case: spectral function and analytic structure of the Breit-Wigner propagator
- FRG, DSE and lattice data: spectral function and analytic structure of the gluon and ghost propagator

Summary and outlook

Schlessinger Point Method (SPM)

Given a finite set of N data points (x_i, f_i) we construct the rational interpolant p(x)/q(x) with polynomials p(x) and q(x) that is given by the continued fraction

$$p(x)/q(x) = C_N(x) = \frac{f_1}{1 + \frac{a_1(x - x_1)}{1 + \frac{a_2(x - x_2)}{\vdots a_{N-1}(x - x_{N-1})}}},$$

where the coefficients a_i are given recursively by $a_1 = \frac{f_1/f_2 - 1}{x_2 - x_1}$ and

$$a_{i} = \frac{1}{x_{i} - x_{i+1}} \left(1 + \frac{a_{i-1}(x_{i+1} - x_{i-1})}{1 + 1} \frac{a_{i-2}(x_{i+1} - x_{i-2})}{1 + 1} \cdots \frac{a_{1}(x_{i+1} - x_{1})}{1 - f_{1}/f_{i+1}} \right)$$

The polynomials (p(x), q(x)) are of order (N/2 - 1, N/2) for an even number of input points and ((N - 1)/2, (N - 1)/2) for an odd number of input points

[L. Schlessinger, Physical Review, Volume 167, Number 5 (1968)]

[R.W. Haymaker and L. Schlesinger, Mathematics in Science and Engineering, Volume 71, Chapter 11 (1970)]

[H.J. Vidberg and J.W. Serene, Journal of Low Temperature Physics, Vol. 29, Nos. 3/4 (1977)]

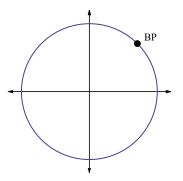
[R.-A. T., I. Haritan, J. Wambach, N. Moiseyev, Physics Letters B 774 (2017) 411-416]

[R.-A. T., P. Gubler, M. Ulybyshev, L. v. Smekal, Comput. Phys. Commun. 237 (2019) 129-142]

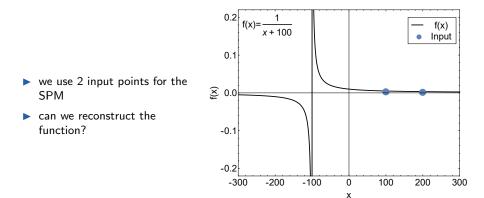
Analytic Continuation and Radius of Convergence

- an analytic continuation into the complex plane can be performed by choosing x in C_N(x) to be complex, i.e. x = αe^{iθ}
- rational interpolants can exactly reproduce polar singularities, thus extending the 'radius of convergence' to the first non-polar singularity, e.g. a branch point
- even a branch cut may be well approximated by a series of poles of the rational fraction
- a rational fraction can have only one sheet in the complex plane - a many-sheeted function can only be reconstructed on a single sheet

[R. de Montessus de Ballore, Bull. Soc. Math. France 30, 28 (1902)]
 [P. Masjuan, J.J. Sanz-Cillero, Eur.Phys.J. C73 (2013) 2594]

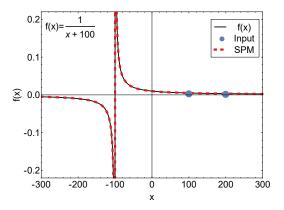


Simple Example: f(x) = 1/(x + 100)

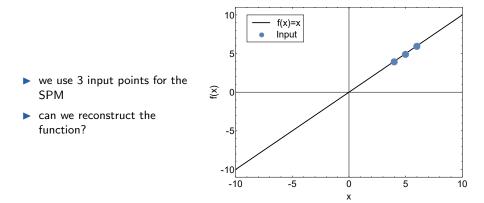


Simple Example: f(x) = 1/(x + 100)

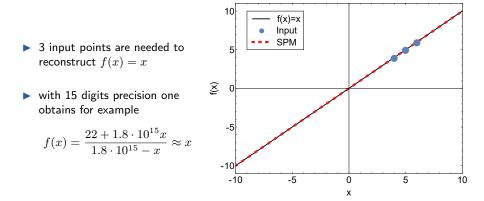
- ► Only 2 input points are needed to reconstruct f(x) = 1/(x+100)
- it is the "first guess" of the method



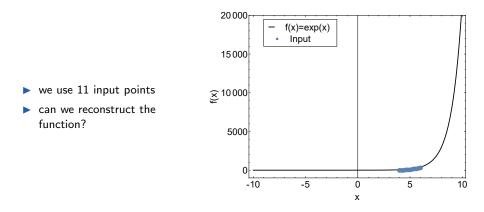
Another simple example: f(x) = x



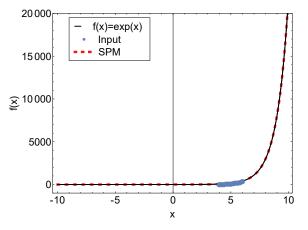
Another simple example: f(x) = x



Another example: $f(x) = e^x$



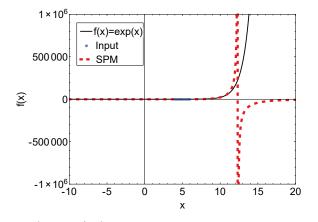
Another example: $f(x) = e^x$



▶ for 11 input points we obtain

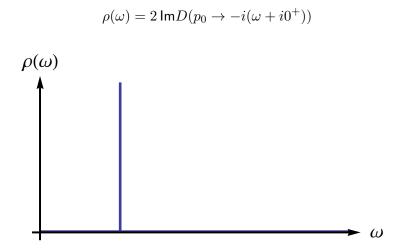
$$f(x) = \frac{263504 + 170536 x + 46451 x^2 + 10389 x^3 + 756 x^4 + 148 x^5}{265568 - 98809 x + 15473 x^2 - 1274 x^3 + 55 x^4 - x^5}$$

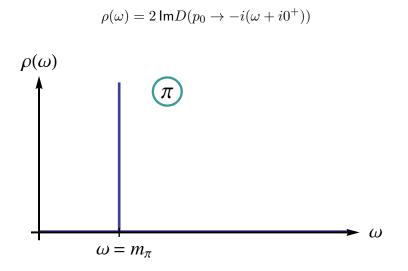
Another example: $f(x) = e^x$

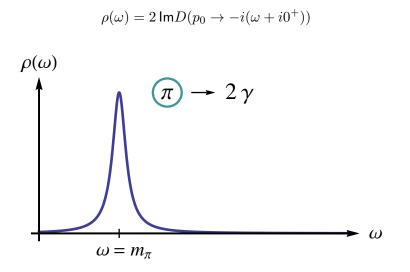


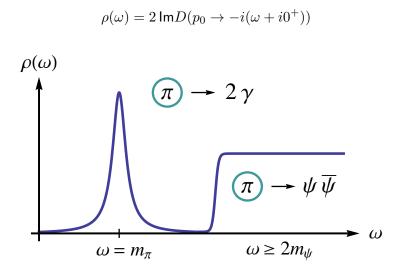
▶ for 11 input points we obtain

$$C_N(x) = \frac{263504 + 170536 x + 46451 x^2 + 10389 x^3 + 756 x^4 + 148 x^5}{265568 - 98809 x + 15473 x^2 - 1274 x^3 + 55 x^4 - x^5}$$







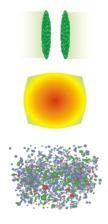


Källén-Lehmann spectral representation

$$\rho(\omega) = 2 \operatorname{Im} D(p_0 \to -i(\omega + i0^+))$$

$$D(p_0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega$$

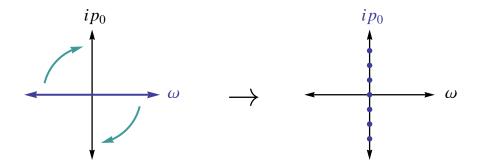
The spectral function thus allows access to many observables, e.g. transport coefficients like the shear viscosity:



[B. Mueller, arXiv: 1309.7616]

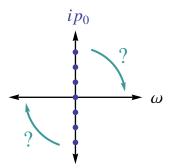
The analytic continuation problem

Calculations at finite temperature are often performed using imaginary energies:



The analytic continuation problem

Analytic continuation problem: How to get back to real energies?

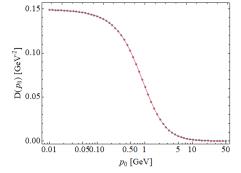


Breit-Wigner (BW) propagator

$$D(p_0) = \frac{1}{2\pi} \frac{1}{(p_0 + \Gamma)^2 + M^2}$$

$$\begin{split} \rho(\omega) &= 2 \operatorname{Im} D(p_0 \to -i(\omega + i0^+)) \\ &= \frac{1}{\pi} \frac{2\Gamma\omega}{(\omega^2 - \Gamma^2 - M^2)^2 + 4\Gamma^2\omega^2} \end{split}$$

$$D(p_0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega$$



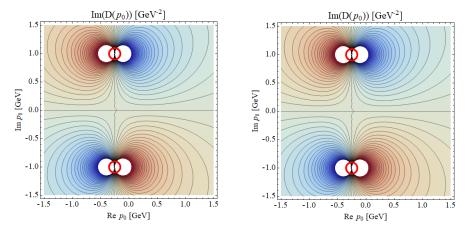
We will use $M = 4\Gamma = 1$ GeV and 60 input points for the SPM.

BW propagator in the complex p_0 plane

The poles are perfectly reconstructed with the SPM:

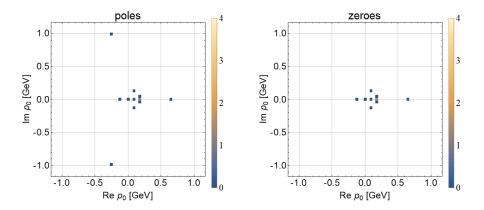
exact:





BW propagator in the complex p_0 plane

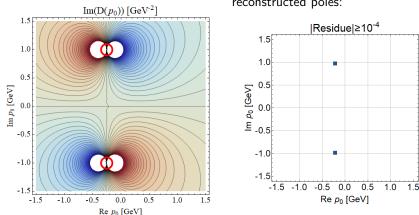
For N = 60 input points the reconstructed propagator has 30 poles and 29 zeroes. Unphysical poles are (nearly) canceled by the zeroes: they have small residues.



BW propagator in the complex p_0 plane

The physical poles can be identified by using a threshold for the residues:

exact:



reconstructed poles:

100

80

60

40

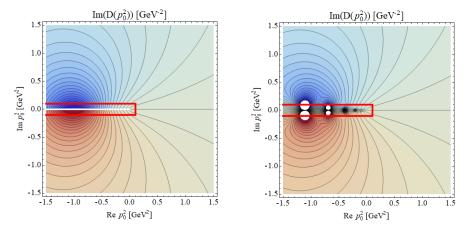
20

BW propagator in the complex p_0^2 plane

The branch cut is reconstructed as a series of poles:

exact:

reconstructed:



BW propagator in the complex p_0^2 plane

The branch cut is more clearly visible in a histogram, showing the location of the poles for 100 random subsets of the 60 input points.

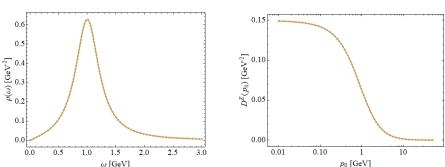
exact: reconstructed poles: $Im(D(p_0^2))$ [GeV⁻²] 1.5 |Residue|≥10⁻⁴ 1.0 0.5 60 $\mathrm{Im}\,p_0^2\,[\mathrm{GeV}^2]$ 80 0.0 60 40 40 -0.5 20 $\text{Im } p_0^2 \text{ [GeV}^2 \text{]}$ 20 -1.0 Re p_0^2 [GeV²] -1.5 -1.0 -0.5 0.5 1.0 -1.5 0.0 1.5 Re p_0^2 [GeV²]

BW spectral function

reconstructed spectral function:

The spectral functions is obtained as $\rho(\omega)=2\,{\rm Im}D(p_0\to -i(\omega+i0^+))$

and fulfills $D(p_0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega$.



reconstructed propagator:

BW propagator with complex poles

$$\begin{split} D(p_0) &= \frac{1}{2\pi} \frac{1}{(p_0 + \Gamma)^2 + M^2} + \sum_{j=1}^n \frac{Z_j}{p_0^2 - z_j} \\ \rho(\omega) &= 2 \operatorname{Im} D(p_0 \to -i(\omega + i0^+)) \\ &= \frac{1}{\pi} \frac{2 \Gamma \omega}{(\omega^2 - \Gamma^2 - M^2)^2 + 4\Gamma^2 \omega^2} \\ D(p_0) &= \frac{1}{2\pi} \int_{-\infty}^\infty \frac{2\omega \rho(\omega)}{\omega^2 + p_0^2} d\omega + \sum_{j=1}^n \frac{Z_j}{p_0^2 - z_j} \end{split}$$

We will use $M = 4\Gamma = 1$ GeV, $Z_1 = Z_2 = 1$, $z_{1,2} = (-1 \pm i)$ GeV².

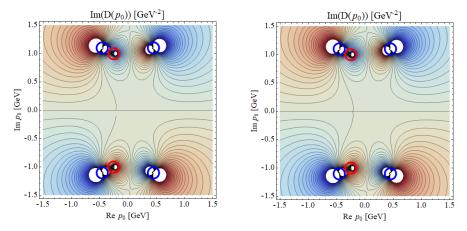
- [D. Binosi and R.-A. T., in preparation]
- [Y. Hayashi, K.-I. Kondo, arXiv: 1812.03116]
- [F. Siringo, EPJ Web Conf. 137, 13017 (2017)]

BW with complex poles in the p_0 plane

The poles are perfectly reconstructed with the SPM:

exact:

reconstructed:

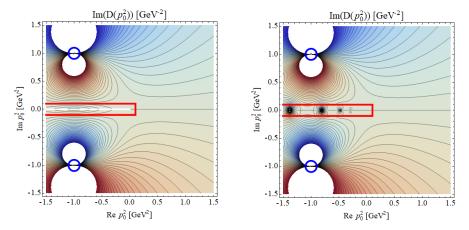


BW with complex poles in the p_0^2 plane

The branch cut is reconstructed as a series of poles:

exact:

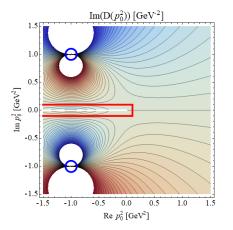
reconstructed:



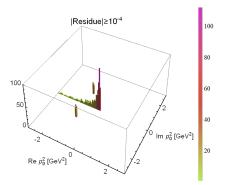
BW with complex poles in the p_0^2 plane

Both the branch cut and the poles are visible in the histogram:

exact:



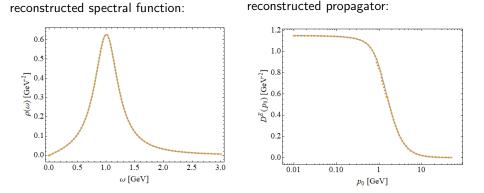
reconstructed poles:



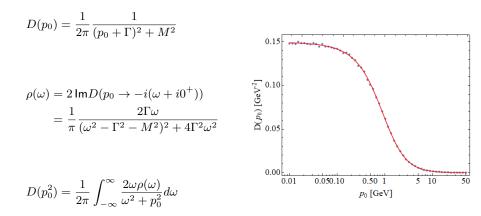
BW propagator with complex poles

The spectral functions is obtained as $\rho(\omega) = 2 \operatorname{Im} D(p_0 \rightarrow -i(\omega + i0^+))$

and fulfills the generalized spectral representation.



BW propagator with noise



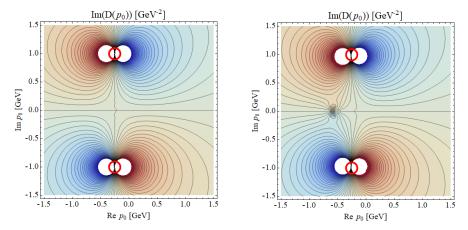
We will use $M = 4\Gamma = 1$ GeV and add noise: $y_i \rightarrow y_i(1 + \varepsilon r_i)$ with $\varepsilon = 10^{-2}$ and r_i a random number drawn from a normal distribution with zero mean and unit standard deviation.

BW propagator with noise in the p_0 plane

The poles are still very well reconstructed with the SPM:

exact:

reconstructed:

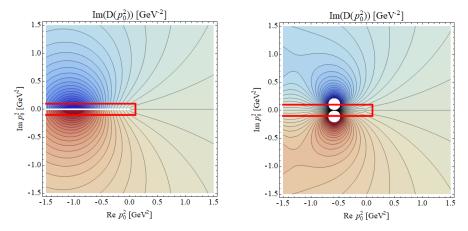


BW propagator with noise in the p_0^2 plane

The branch cut is reconstructed as a series of poles:

exact:

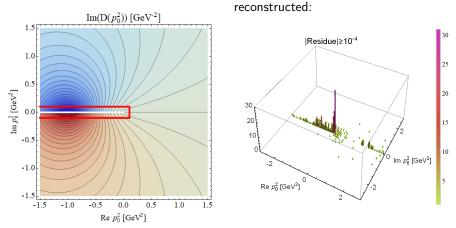
reconstructed:



BW propagator with noise in the p_0^2 plane

The branch cut is reconstructed as a series of poles:

exact:



BW propagator with noise

The spectral functions is obtained as $\rho(\omega)=2\,{\rm Im}D(p_0\to -i(\omega+i0^+))$

and fulfills $D(p_0) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega$.

reconstructed spectral function:

0.15 0.6 0.5 $D^{E}(p_{0})$ [GeV²] 0.00 0002 $\rho(\omega) \begin{bmatrix} 0.4 \\ 0.3 \end{bmatrix} \begin{bmatrix} 0.6 \\ 0.3 \end{bmatrix}$ 0.1 0.0 0.00 0.10 0.0 0.5 1.0 1.5 2.0 2.5 3.0 0.01 10 p_0 [GeV] ω [GeV]

reconstructed propagator:

BW with complex poles and noise

$$D(p_0) = \frac{1}{2\pi} \frac{1}{(p_0 + \Gamma)^2 + M^2} + \sum_{j=1}^n \frac{Z_j}{p_0^2 - z_j}$$

$$\rho(\omega) = 2 \operatorname{Im} D(p_0 \to -i(\omega + i0^+))$$

$$= \frac{1}{\pi} \frac{2\Gamma\omega}{(\omega^2 - \Gamma^2 - M^2)^2 + 4\Gamma^2\omega^2}$$

$$D(p_0^2) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega + \sum_{j=1}^n \frac{Z_j}{p_0^2 - z_j}$$

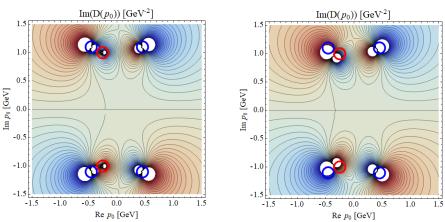
$$D(p_0^2) = \frac{1}{2\pi} \int_{-\infty}^{\infty} \frac{2\omega\rho(\omega)}{\omega^2 + p_0^2} d\omega + \sum_{j=1}^n \frac{Z_j}{p_0^2 - z_j}$$

We will use $M = 4\Gamma = 1$ GeV, $Z_1 = Z_2 = 1$, $z_{1,2} = (-1 \pm i)$ GeV². and add noise: $y_i \rightarrow y_i(1 + \varepsilon r_i)$ with $\varepsilon = 10^{-3}$ and r_i a random number drawn from a normal distribution with zero mean and unit standard deviation.

BW with complex poles and noise in the p_0 plane

Some poles are not found when using a single input data set only:

exact:

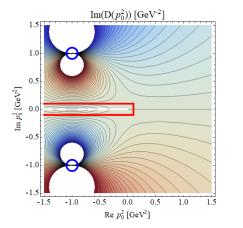


reconstructed:

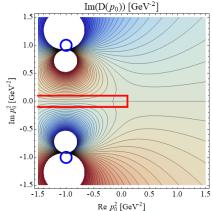
BW with complex poles and noise in the p_0^2 plane

The poles are correctly reconstructed:

exact:



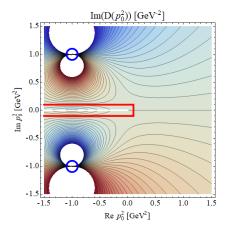
reconstructed:



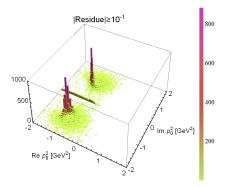
BW with complex poles and noise in the p_0^2 plane

The poles and the branch cut are clearly visible in the histogram:

exact:



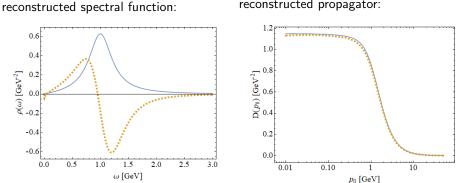
reconstructed:



BW with complex poles and noise

The spectral functions is obtained as $\rho(\omega) = 2 \operatorname{Im} D(p_0 \rightarrow -i(\omega + i0^+))$

and fulfills the generalized spectral representation.



reconstructed propagator:

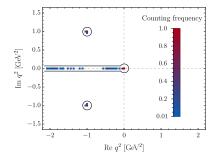
- 1. Select N = 50 points randomly from the set of M > N points (x_i, y_i) for $D(p_0)$
- 2. Apply the SPM to this subset of points and construct $C_N(x)$
- 3. Obtain the spectral function as $\rho(\omega) = 2 \text{Im} C_N(-i(\omega + i0^+))$
- 4. Identify the relevant complex poles and compute $D_{\mathsf{rec}}(p_0)$
- 5. Calculate the χ^2 -deviation of the reconstr. propagator, $X^2 = \sum_{i=1}^{M} \frac{(D_{\text{rec}}(x_i) D(x_i))^2}{D(x_i)}$

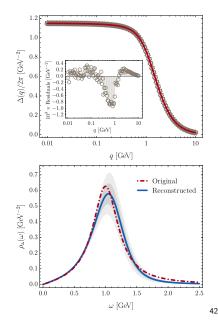
6. repeat 1.-5. L = 5000 times and identify the input point (x_j, y_j) that appears most often among the K = 200 best subsets, i.e. those with the smallest X^2

7. repeat 1.-6. but always use the points (x_j, y_j) among the N = 50 points until all optimal input points have been identified

BW with complex poles and noise

We apply the improved SPM algorithm to the BW propagator with complex poles:



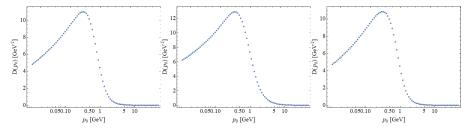


We will study FRG data on the gluon in Landau gauge SU(3) Yang-Mills theory:

Data set 1: Fit (with noise $\epsilon = 10^{-6}$) from Cyrol et al., SciPost Phys. 5, 065 (2018)

Data set 2: Same as 1 but with additional complex conjugate poles in p_0^2

Data set 3: FRG data from Cyrol et al., Phys. Rev. D 94, 054005 (2016)



Data set 1

$$\begin{split} \hat{G}_{\mathsf{Ans}}^{\mathsf{pole}}(p_0) &= \sum_{k=1}^{N_{\mathsf{p}}} \prod_{j=1}^{N_{\mathsf{p}}^{(k)}} \left(\frac{\hat{\mathcal{N}}_k}{(\hat{p}_0 + \hat{\Gamma}_{k,j})^2 + \hat{\mathcal{M}}_{k,j}^2} \right)^{\delta_{k,j}}, \quad \hat{G}_{\mathsf{Ans}}^{\mathsf{poly}}(p_0) &= \sum_{j=1}^{N_{\mathsf{poly}}} \hat{a}_k \left(\hat{p}_0^2 \right)^{\frac{j}{2}} \\ \hat{G}_{\mathsf{Ans}}^{\mathsf{asy}}(p_0) &= (\hat{p}_0^2)^{-1-2\alpha} \left[\log \left(1 + \frac{\hat{p}_0^2}{\hat{\lambda}^2} \right) \right]^{-1-\beta}, \quad G_{\mathsf{Ans}}(p_0) = \mathcal{K} \hat{G}_{\mathsf{Ans}}^{\mathsf{pole}}(p_0) \hat{G}_{\mathsf{Ans}}^{\mathsf{poly}}(p_0) \hat{G}_{\mathsf{Ans}}^{\mathsf{asy}}(p_0) \end{split}$$

\hat{N}_1	α	β	Â		
1.33678	-0.428714	-0.777213	1.75049		
\hat{a}_1	\hat{a}_2	\hat{a}_3	\hat{a}_4	\hat{a}_5	
0.454024	0.241017	3.10257	-1.30804	0.63701	
$\hat{\Gamma}_{1,1}$	$\hat{\Gamma}_{1,2}$	$\hat{\Gamma}_{1,3}$	$\hat{\Gamma}_{1,4}$	$\hat{\Gamma}_{1,5}$	$\hat{\Gamma}_{1,6}$
0.100169	0.100141	2.36445	1.5564	1.22013	1.15102
$\hat{M}_{1,1}$	$\hat{M}_{1,2}$	$\hat{M}_{1,3}$	$\hat{M}_{1,4}$	$\hat{M}_{1,5}$	$\hat{M}_{1,6}$
0.849883	0.849902	2.52171	2.44035	3.6016	2.36723
$\delta_{1,1}$	$\delta_{1,2}$	$\delta_{1,3}$	$\delta_{1,4}$	$\delta_{1,5}$	$\delta_{1,6}$
1.61116	1.94095	-2.54586	1.89765	0.168592	0.296215

[A. K. Cyrol, J. M. Pawlowski, A. Rothkopf, N. Wink, SciPost Phys. 5, 065 (2018)]

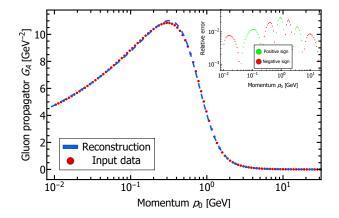
Data set 2

$$\begin{split} \hat{G}_{\mathsf{Ans}}^{\mathsf{pole}}(p_0) &= \sum_{k=1}^{N_{\mathsf{p}\mathsf{p}}} \prod_{j=1}^{N_{\mathsf{p}\mathsf{p}}^{(k)}} \left(\frac{\hat{\mathcal{N}}_k}{(\hat{p}_0 + \hat{\Gamma}_{k,j})^2 + \hat{\mathcal{M}}_{k,j}^2} \right)^{\delta_{k,j}}, \quad \hat{G}_{\mathsf{Ans}}^{\mathsf{poly}}(p_0) = \sum_{j=1}^{N_{\mathsf{poly}}} \hat{a}_k \left(\hat{p}_0^2 \right)^{\frac{j}{2}} \\ \hat{G}_{\mathsf{Ans}}^{\mathsf{asy}}(p_0) &= (\hat{p}_0^2)^{-1-2\alpha} \left[\log \left(1 + \frac{\hat{p}_0^2}{\hat{\lambda}^2} \right) \right]^{-1-\beta} \\ G_{\mathsf{Ans}}(p_0) &= \mathcal{K} \hat{G}_{\mathsf{Ans}}^{\mathsf{pole}}(p_0) \hat{G}_{\mathsf{Ans}}^{\mathsf{poly}}(p_0) \hat{G}_{\mathsf{Ans}}^{\mathsf{asy}}(p_0) + \frac{3}{p_0^2 - (-0.25 + i)} + \frac{3}{p_0^2 - (-0.25 - i)} \end{split}$$

\hat{N}_1	α	β	$\hat{\lambda}$		
1.33678	-0.428714	-0.777213	1.75049		
\hat{a}_1	\hat{a}_2	\hat{a}_3	\hat{a}_4	\hat{a}_5	
0.454024	0.241017	3.10257	-1.30804	0.63701	
$\hat{\Gamma}_{1,1}$	$\hat{\Gamma}_{1,2}$	$\hat{\Gamma}_{1,3}$	$\hat{\Gamma}_{1,4}$	$\hat{\Gamma}_{1,5}$	$\hat{\Gamma}_{1,6}$
0.100169	0.100141	2.36445	1.5564	1.22013	1.15102
$\hat{M}_{1,1}$	$\hat{M}_{1,2}$	$\hat{M}_{1,3}$	$\hat{M}_{1,4}$	$\hat{M}_{1,5}$	$\hat{M}_{1,6}$
0.849883	0.849902	2.52171	2.44035	3.6016	2.36723
$\delta_{1,1}$	$\delta_{1,2}$	$\delta_{1,3}$	$\delta_{1,4}$	$\delta_{1,5}$	$\delta_{1,6}$
1.61116	1.94095	-2.54586	1.89765	0.168592	0.296215

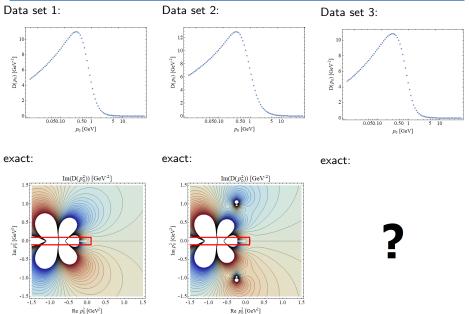
[A. K. Cyrol, J. M. Pawlowski, A. Rothkopf, N. Wink, SciPost Phys. 5, 065 (2018)]

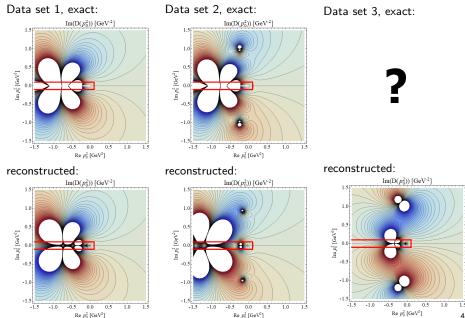
Data set 3

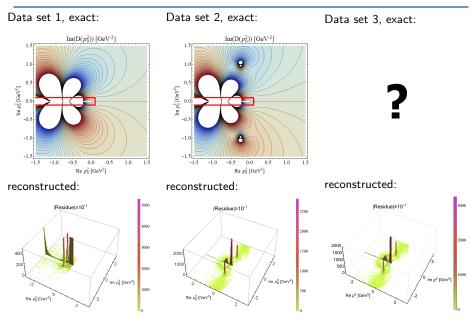




[A. K. Cyrol, J. M. Pawlowski, A. Rothkopf, N. Wink, SciPost Phys. 5, 065 (2018)]



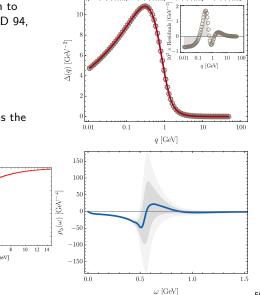


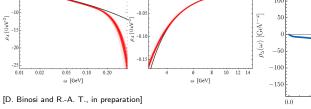


We apply the improved SPM algorithm to the data from Cyrol et al., Phys. Rev. D 94, 054005 (2016).

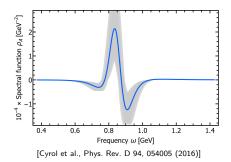
The data show evidence for complex conjugate poles.

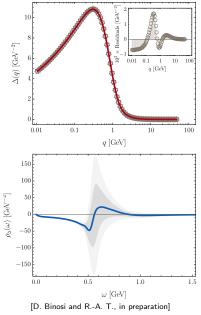
The reconstructed spectral function has the correct IR and UV behavior:



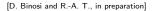


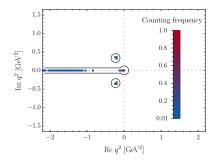
We apply the improved SPM algorithm to the data from Cyrol et al., Phys. Rev. D 94, 054005 (2016).

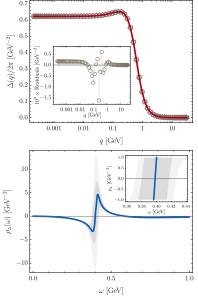




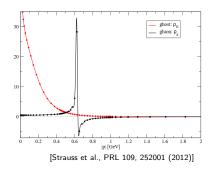
We apply the improved SPM algorithm to data from Strauss, Fischer, Kellermann, PRL 109, 252001 (2012).

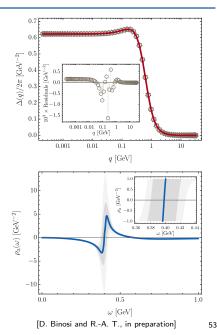






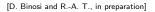
We apply the improved SPM algorithm to data from Strauss, Fischer, Kellermann, PRL 109, 252001 (2012).

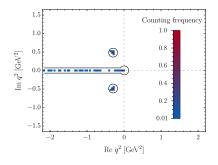


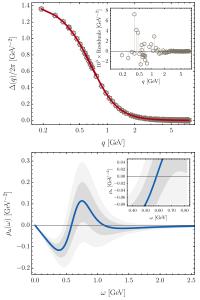


Lattice data on the gluon propagator

We apply the improved SPM algorithm to data obtained on a 64^4 lattice with $\beta = 6.0$ in SU(3) Yang-Mills theory, Duarte, Oliveira, Silva, Phys. Rev. D 94, 014502 (2016).



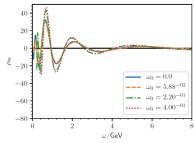




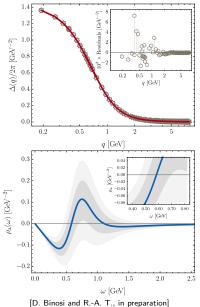
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Tikhonov reconstruction:



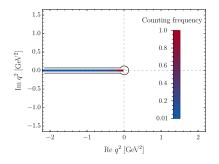
[[]Dudal, Oliveira, Roelfs, Silva, arXiv:1901.05348]

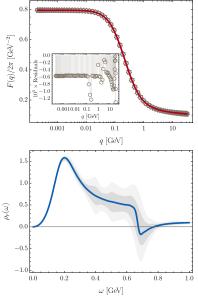


DSE data on the ghost propagator

We apply the improved SPM algorithm to data from Strauss, Fischer, Kellermann, PRL 109, 252001 (2012).

The ghost propagator only exhibits a branch cut.

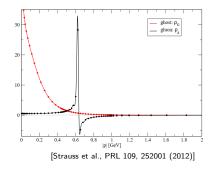


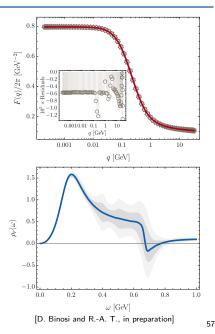


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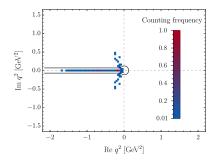


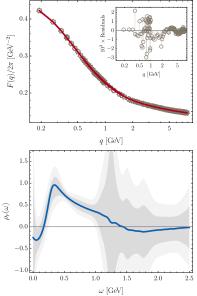


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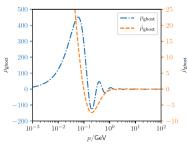


Lattice data on the ghost propagator

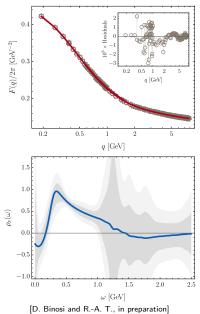
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Tikhonov reconstruction:



[Dudal, Oliveira, Roelfs, Silva, arXiv:1901.05348]



We applied the Schlessinger point method (SPM) to FRG, DSE and lattice data on the Landau gauge SU(3) Yang-Mills gluon and ghost propagator in order to determine their analytic structure in the complex q^2 plane and to reconstruct the corresponding spectral functions:

- \blacktriangleright the gluon and ghost propagators show a branch cut at $q^2 \leq 0$
- in addition, we find evidence for complex conjugate poles in the gluon propagator