

# Listening to NOISE

TYPE THE THREE WORDS

Listening to NOISE



**Noise, sign problems, and statistics**

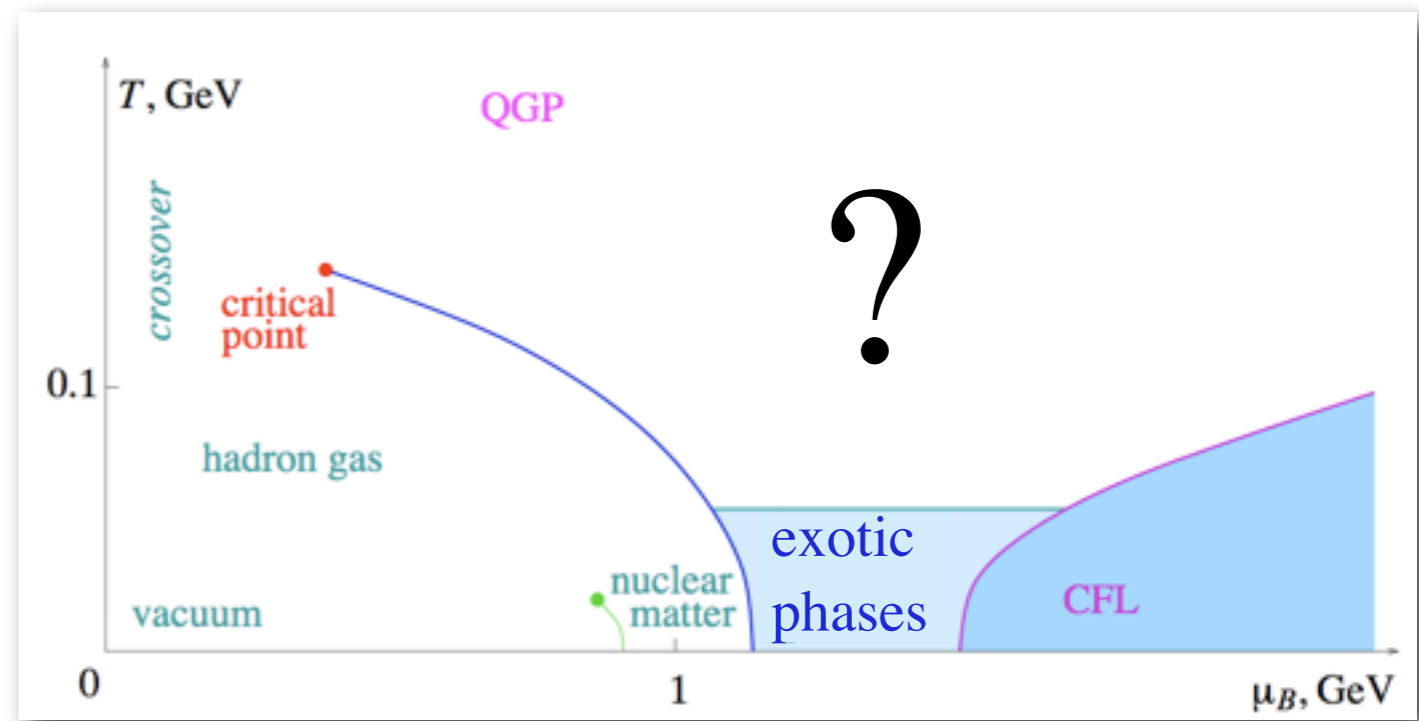
arXiv:1106.0073 [hep-lat]

Michael Endres, D.K., Jong-Wan Lee, Amy Nicholson

...& work in progress

Physics motivation:  
can't we get beyond  
this cartoon??

Sign problem!



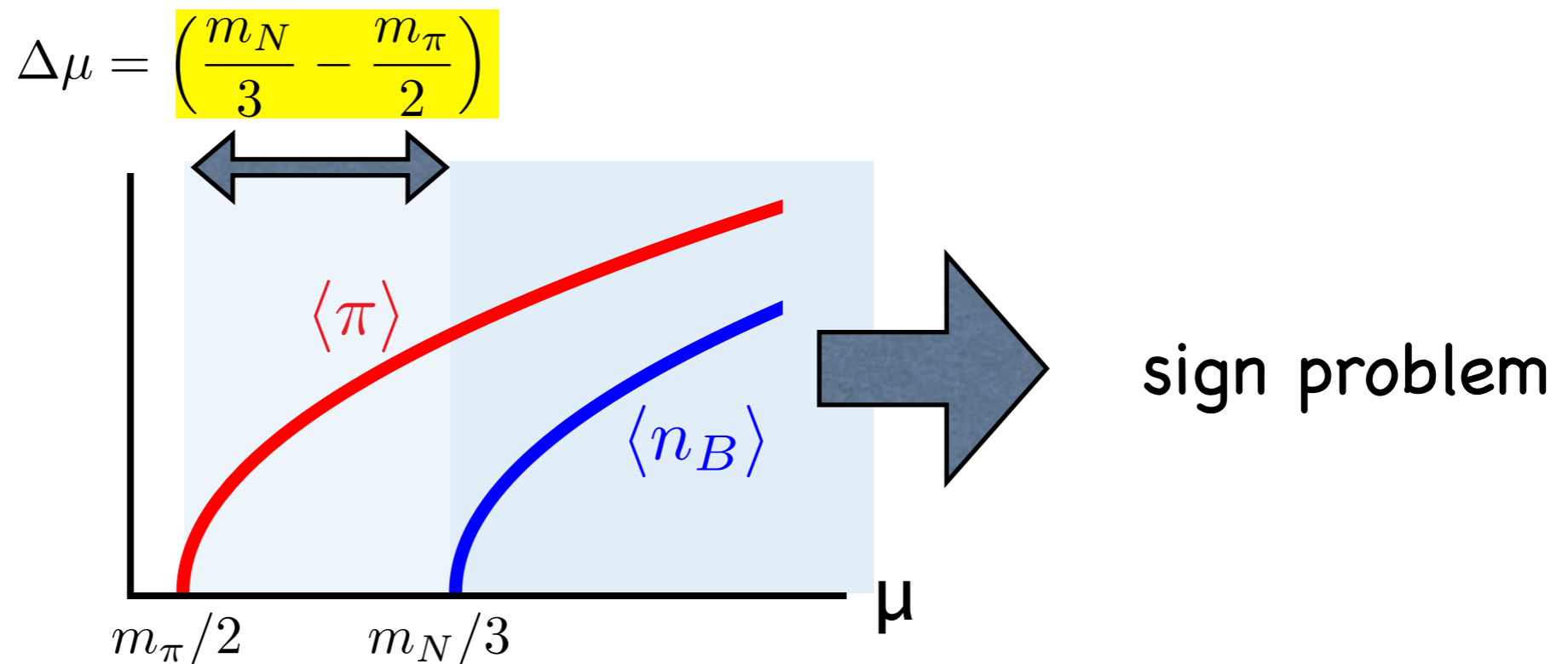
This talk:

- From sign problem to noise
- Surprisingly universal features of noise
- Can these features be used to tame the noise?

# The "sign" problem in the grand canonical approach: $\text{Det}(\not{D} + \mu\gamma^0)$ complex

- physics happens for  $\mu \geq m_N/3$ ...
- ...but sign problem starts at  $\mu = m_\pi/2$  !

*P.E. Gibbs, 1986*



Explanation (2-flavor QCD):

$|\text{Det}(\not{D} + \mu\gamma^0)| \approx$  isospin chemical potential

Role of phase: eliminate pion condensate for  $\mu \geq m_\pi/2$ !

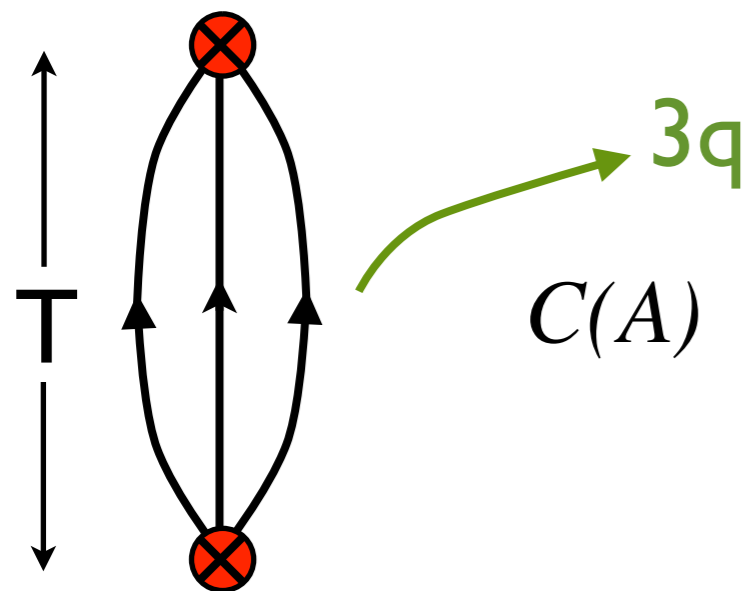
*K. Splittorff  
 J. Verbaarschot, 2006*

Canonical approach?

Compute correlator of N quarks with  $\mu=0$

No sign problem...but now a noise problem

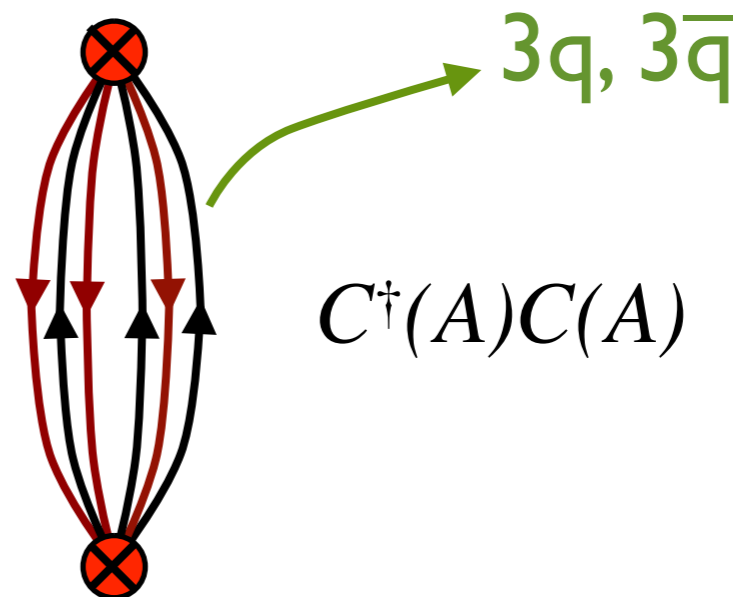
Parisi, Lepage  
1980's



$C(A)$

nucleon correlator

signal:  $\sim e^{-m_N T}$

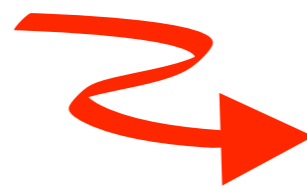


$C^\dagger(A)C(A)$

noise:

$\sim \frac{1}{\sqrt{N_{\text{conf}}}} e^{-\frac{3}{2}m_\pi T}$

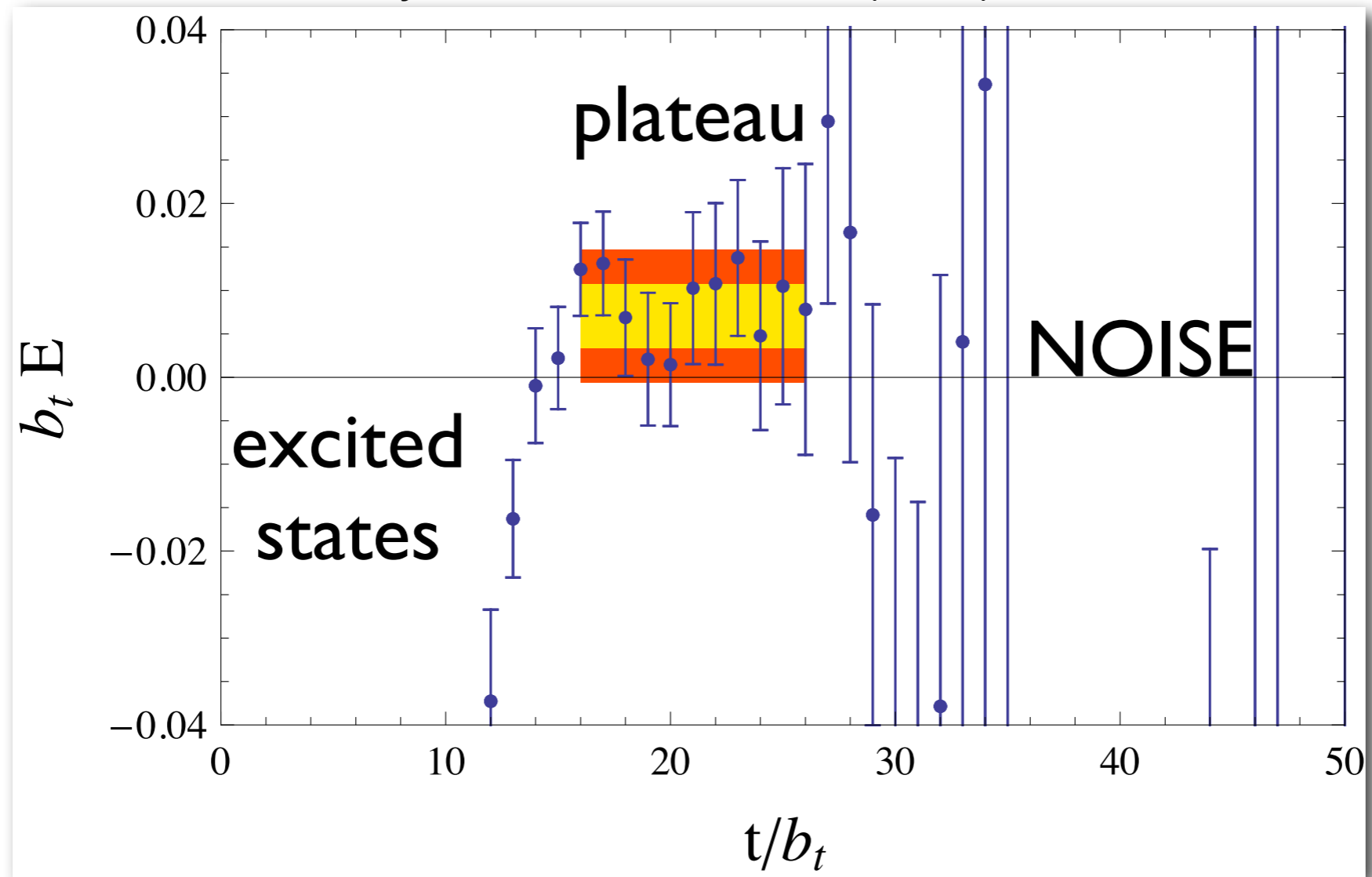
$$\frac{\text{signal}}{\text{noise}} \sim \sqrt{N_{\text{conf.}}} e^{-3T \left( \frac{m_N}{3} - \frac{m_\pi}{2} \right)}$$



Same factor as grand canonical

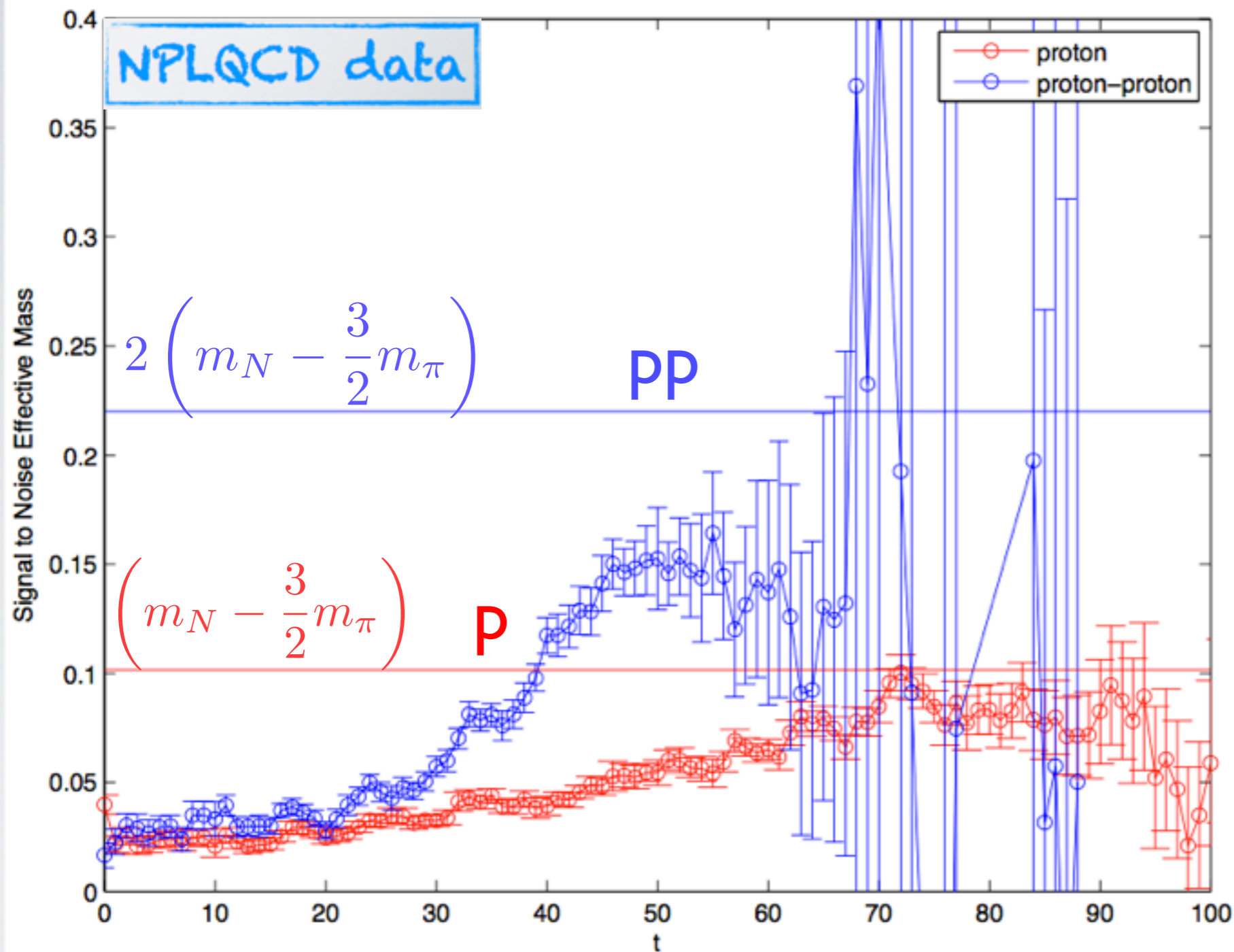
# EXAMPLE:

**Triton B.E.** S. R. Beane et al. (NPLQCD),  
Phys. Rev. D 80, 074501 (2009)  $(m_\pi = 390 \text{ MeV})$



# Actual QCD data

Plotted: 
$$-\frac{1}{t} \ln \frac{\sigma(t)}{\bar{x}(t)} \sim A \left( m_N - \frac{3}{2} m_\pi \right)$$



Conclusion:  
Parisi/Lepage  
= qualitative estimate  
of noise problem

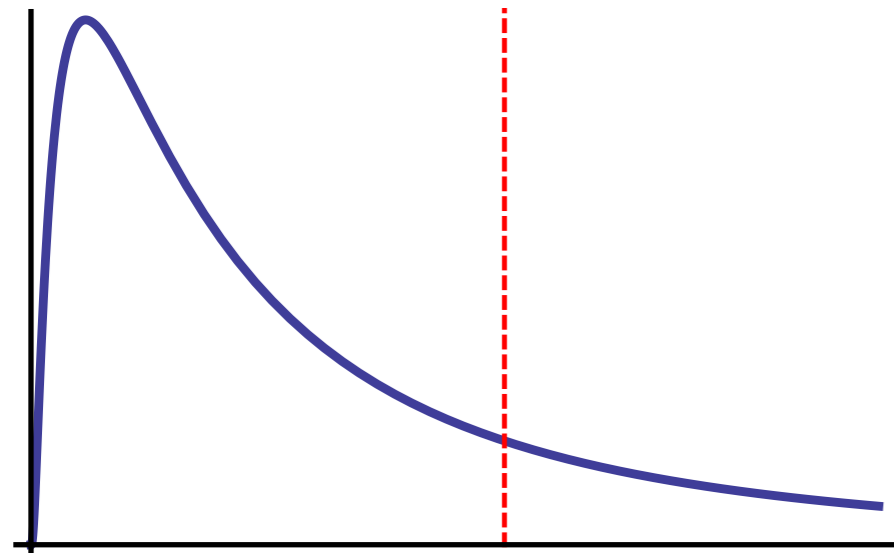






Possible sources of noise: consider distribution of correlators over ensemble of gauge fields

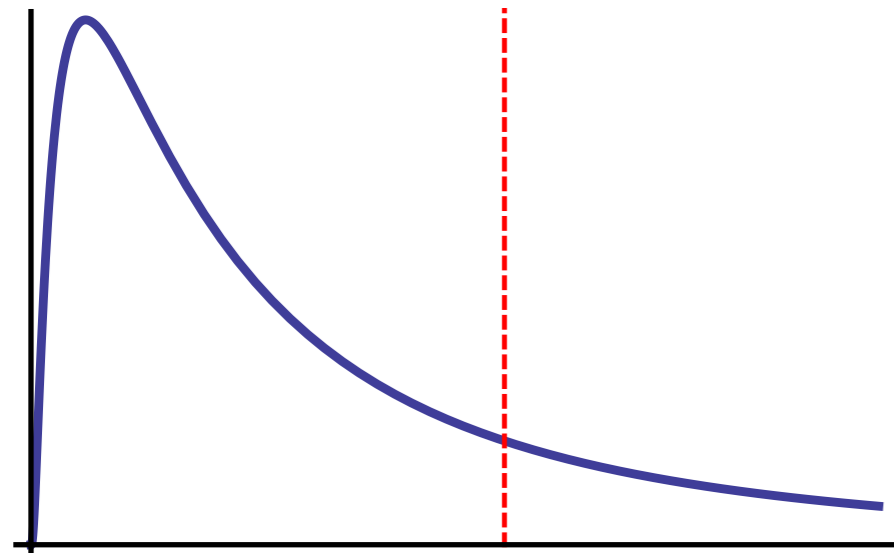
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correlator

- *Long tail, small mean*
- *“overlap problem”*  
*poor sampling*

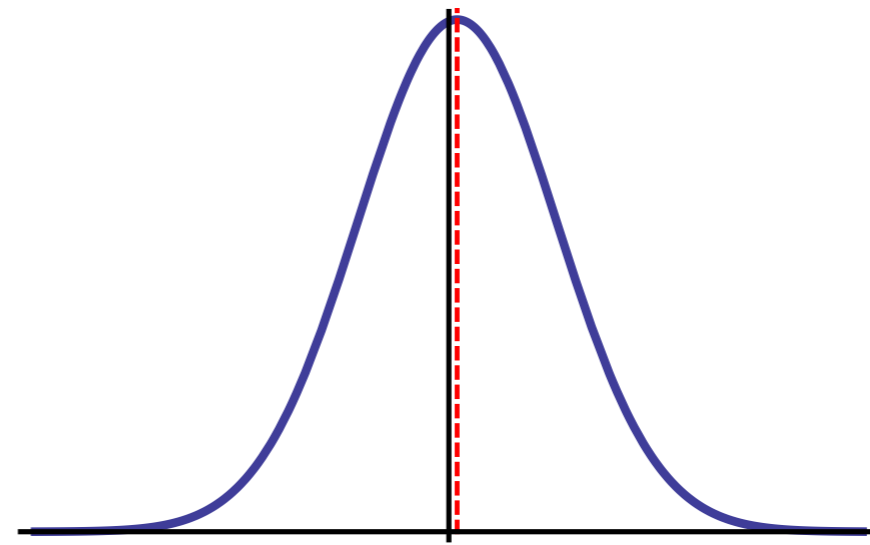
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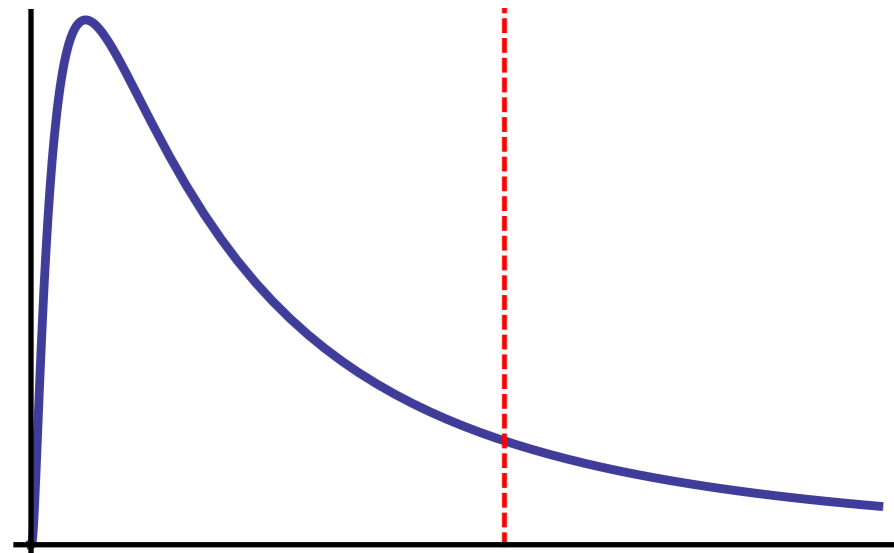
Possibility B:



correlator

- *Almost symmetric, small mean*
- *“sign problem”*  
*big cancellations*

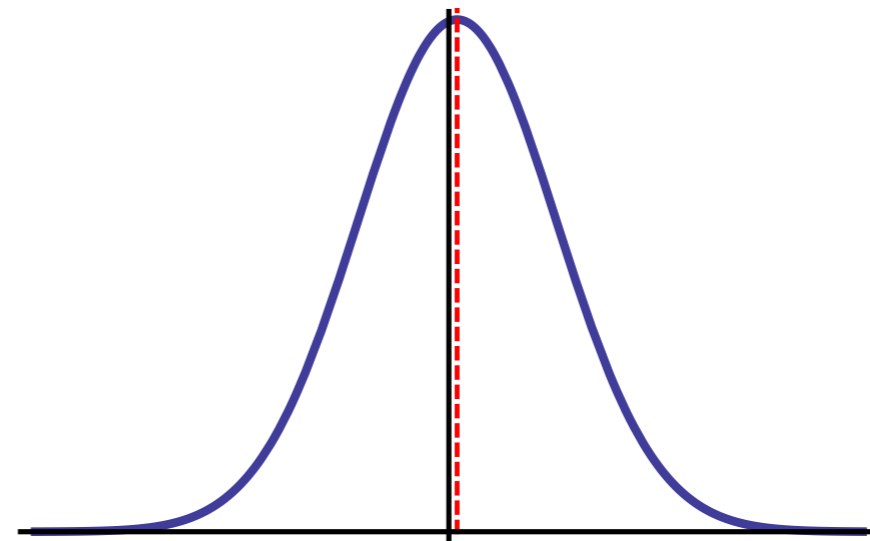
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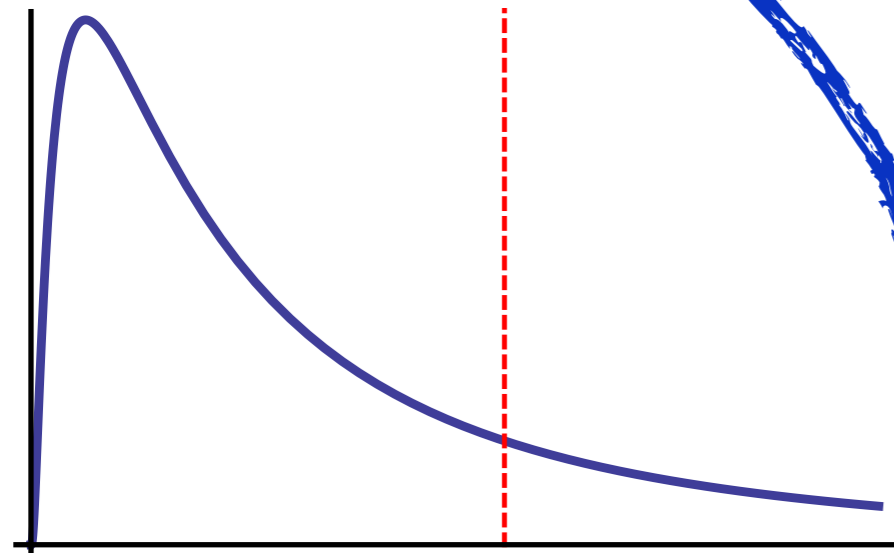
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Both possibilities could occur

Either could be related to a sign problem in grand canonical

Look at a simpler system: unitary fermions

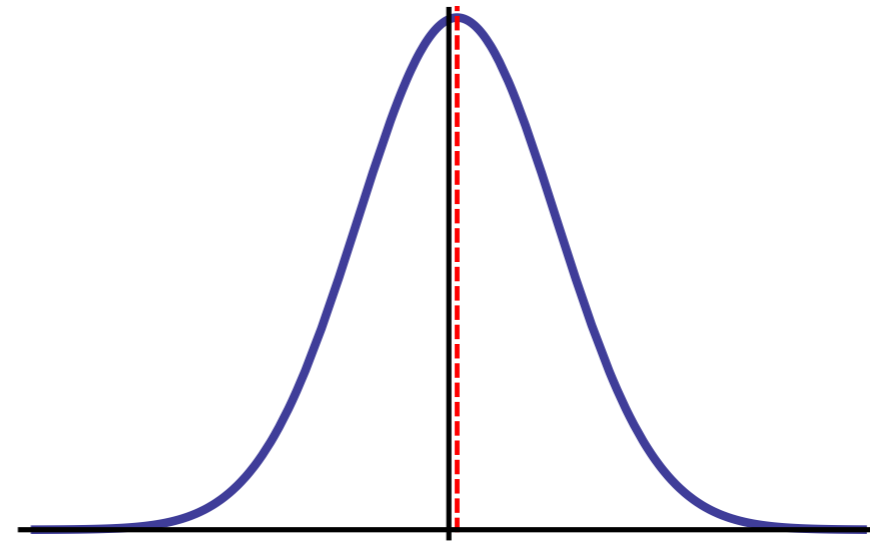
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Look at a simpler system: unitary fermions

# Digression: what are unitary fermions?

(Lattice 2011 talks by J. Drut, J.-W. Lee)

Nonrelativistic 2-particle scattering:

$$\mathcal{A} = \frac{4\pi}{M} \frac{1}{p \cot \delta - ip}$$

phase  
shift



"unitary" fermions:  $p \cot \delta = 0$

$$\delta(p) = \frac{\pi}{2}$$

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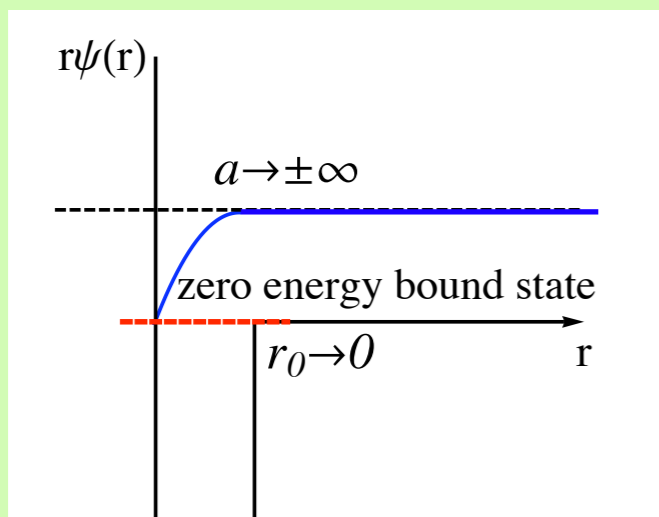
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"unitary" fermions:  $p \cot \delta = 0$

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Zero-range potential  
Zero-energy bound state



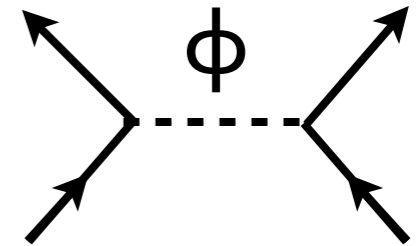
- ◆ A strongly-coupled conformal system
- ◆ Studied experimentally with dilute trapped atoms @ Feshbach resonance

(JILA, MIT, Innsbruck)

- ◆ Exhibits superfluidity

Lattice model: M. Endres, D.K., J.W. Lee, A. Nicholson, arXiv:1106.5725 [hep-lat]

- Nonrelativistic fermions,  $\mu=0$
- Short-range momentum-dependent 4-fermion interaction induced by auxiliary scalar field
- Interaction tuned to conformal fixed pt.

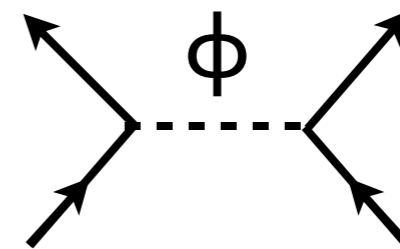


- Less severe sign problem than QCD; no gauge symmetry; nonrelativistic (quenched)
- Have simulated up to  $N=70$  fermions on  $14^3 \times 64$  lattice
- $\sim 1\%$  accuracy in energies
- up to 2 billion configurations for auxiliary field



Simulation:

$\phi$  lives on time links  
(couples to  $\psi^*\psi$ )

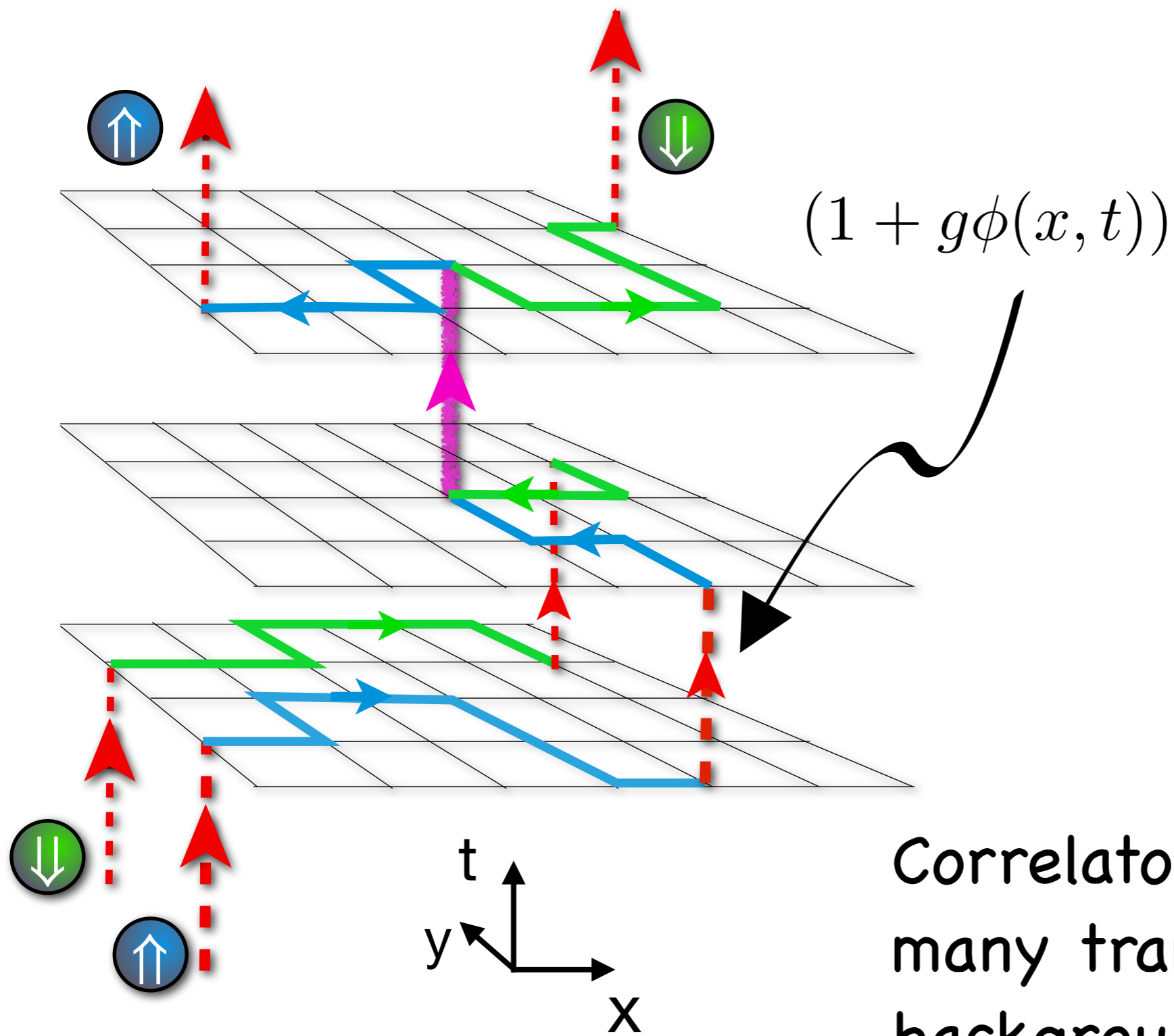


Generate an ensemble of random  $\phi$  fields, compute average of an N-particle correlator  $C_N(T; \phi)$  from  $t=0$  to  $t=T$

Extract ground state energy:

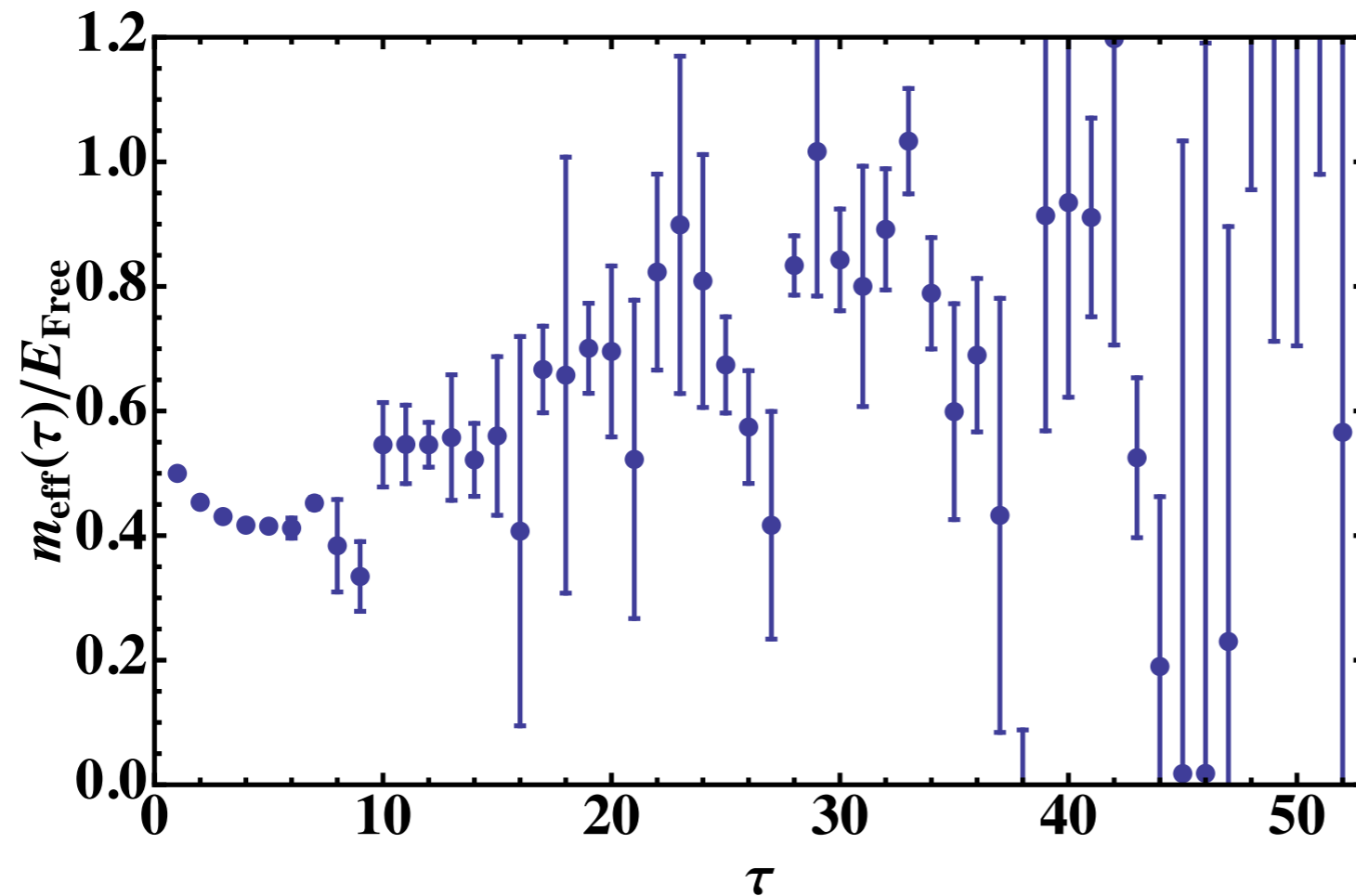
$$E_N = \lim_{T \rightarrow \infty} \left[ -\frac{1}{T} \ln \langle C_N(T, \phi) \rangle_\phi \right]$$

Plot  $-\frac{1}{T} \ln \langle C_N(T, \phi) \rangle_\phi$   
vs  $T$ , look for "plateau"



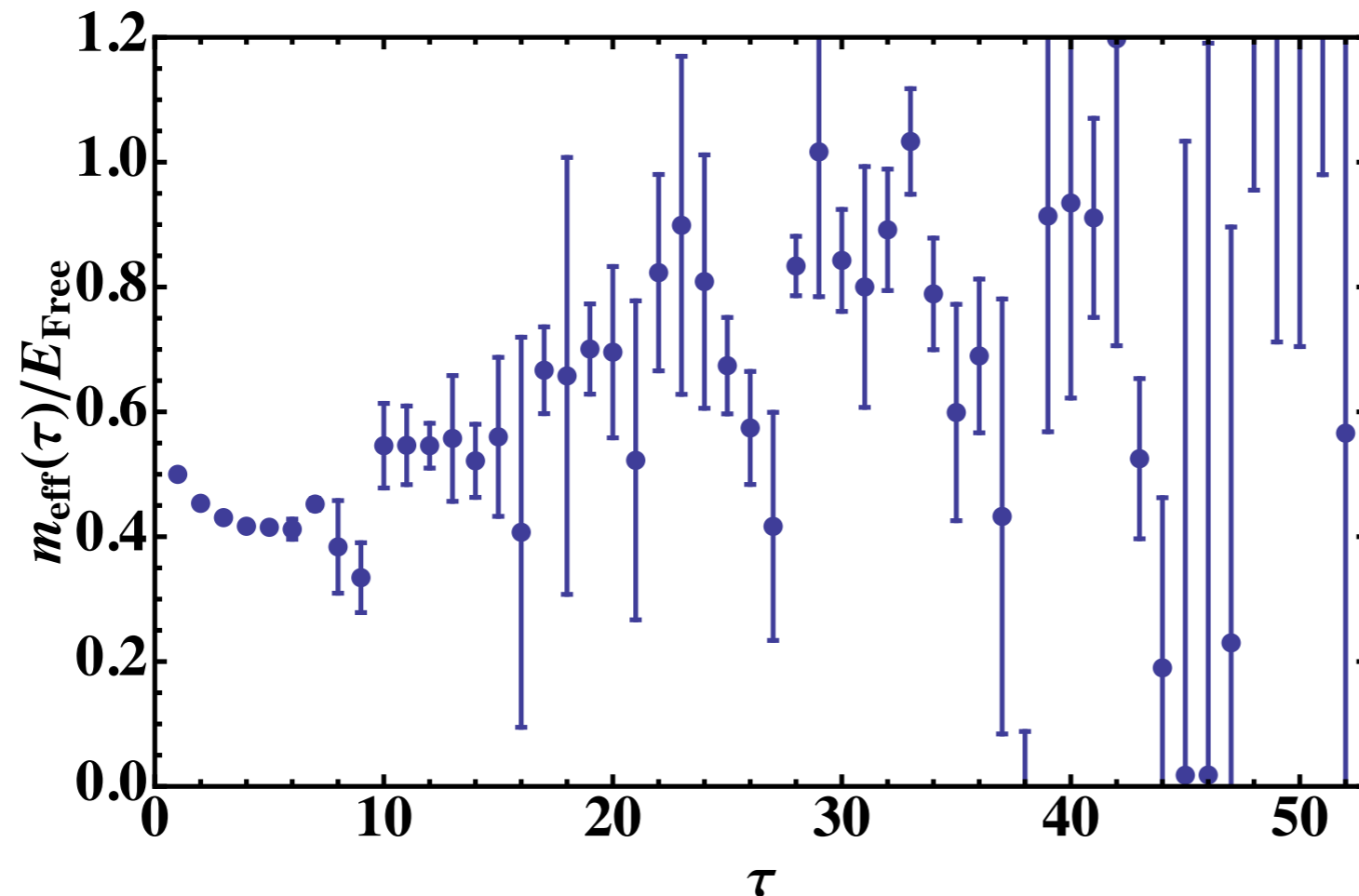
Correlators are products of many transfer matrices in background random  $\Phi$

# Example of conventional effective mass plot



**N= 46 fermions**  
**L=12**  
**40 M configs**

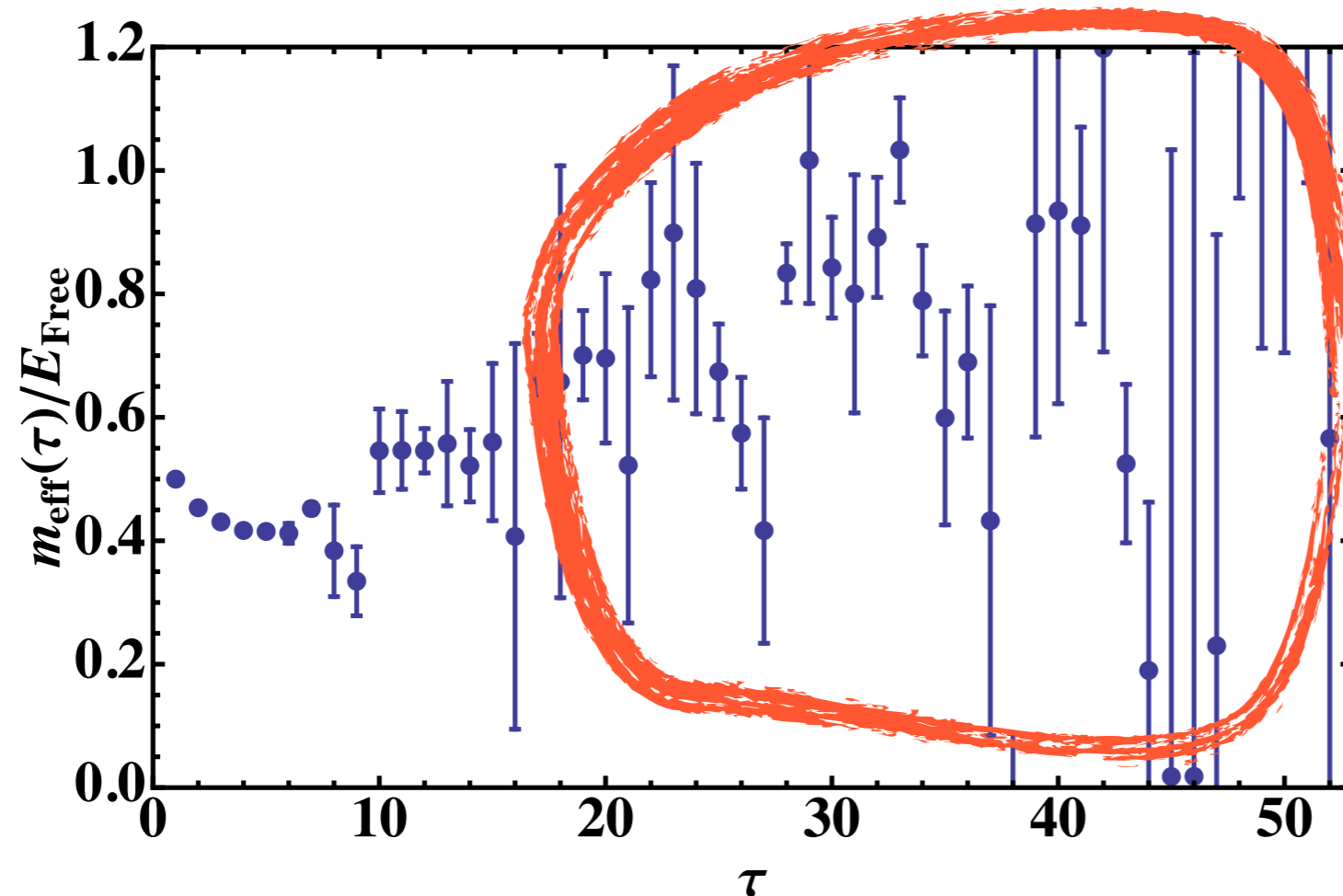
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- **noise**
- *drift*
- worse for larger N= # fermions

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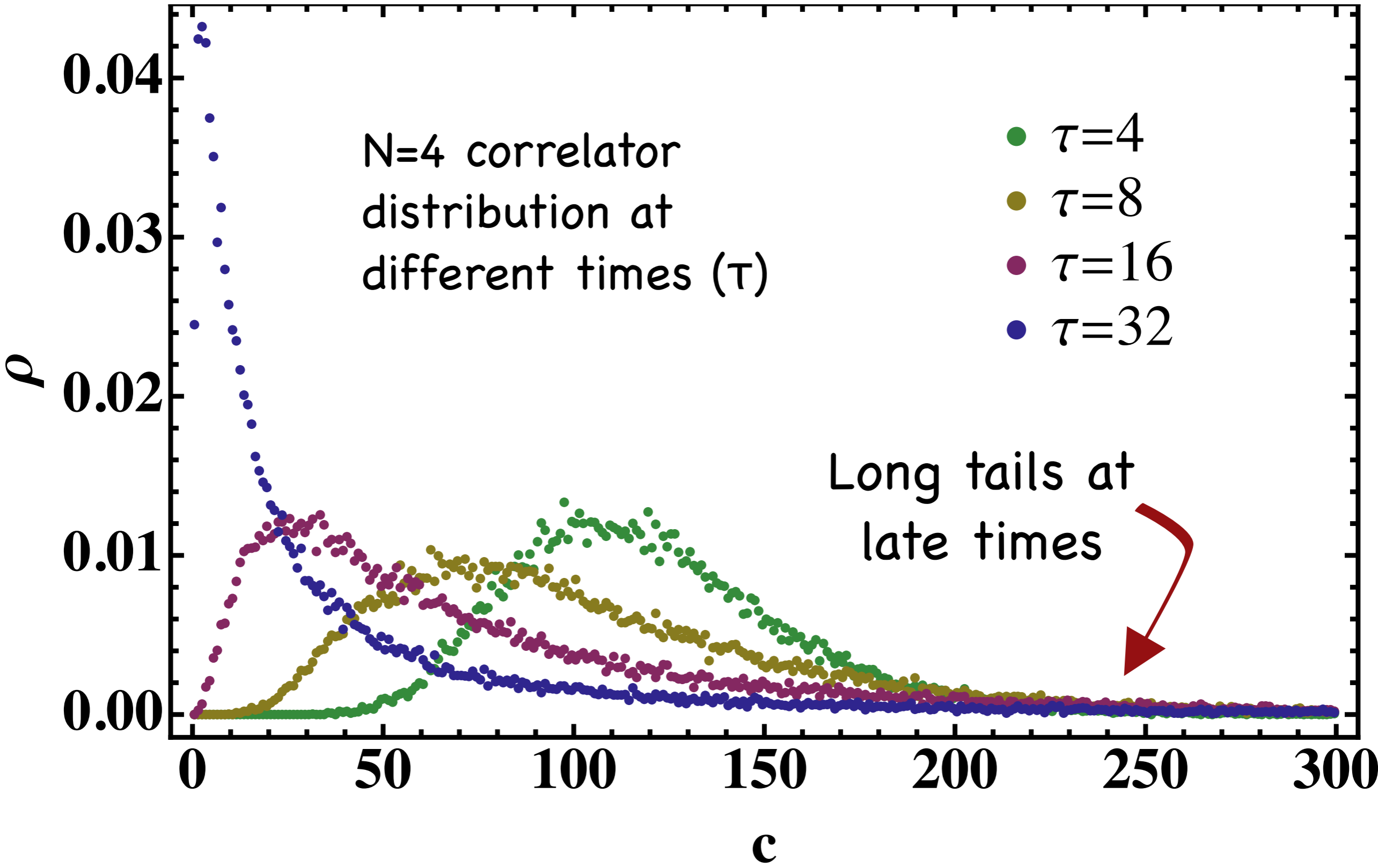


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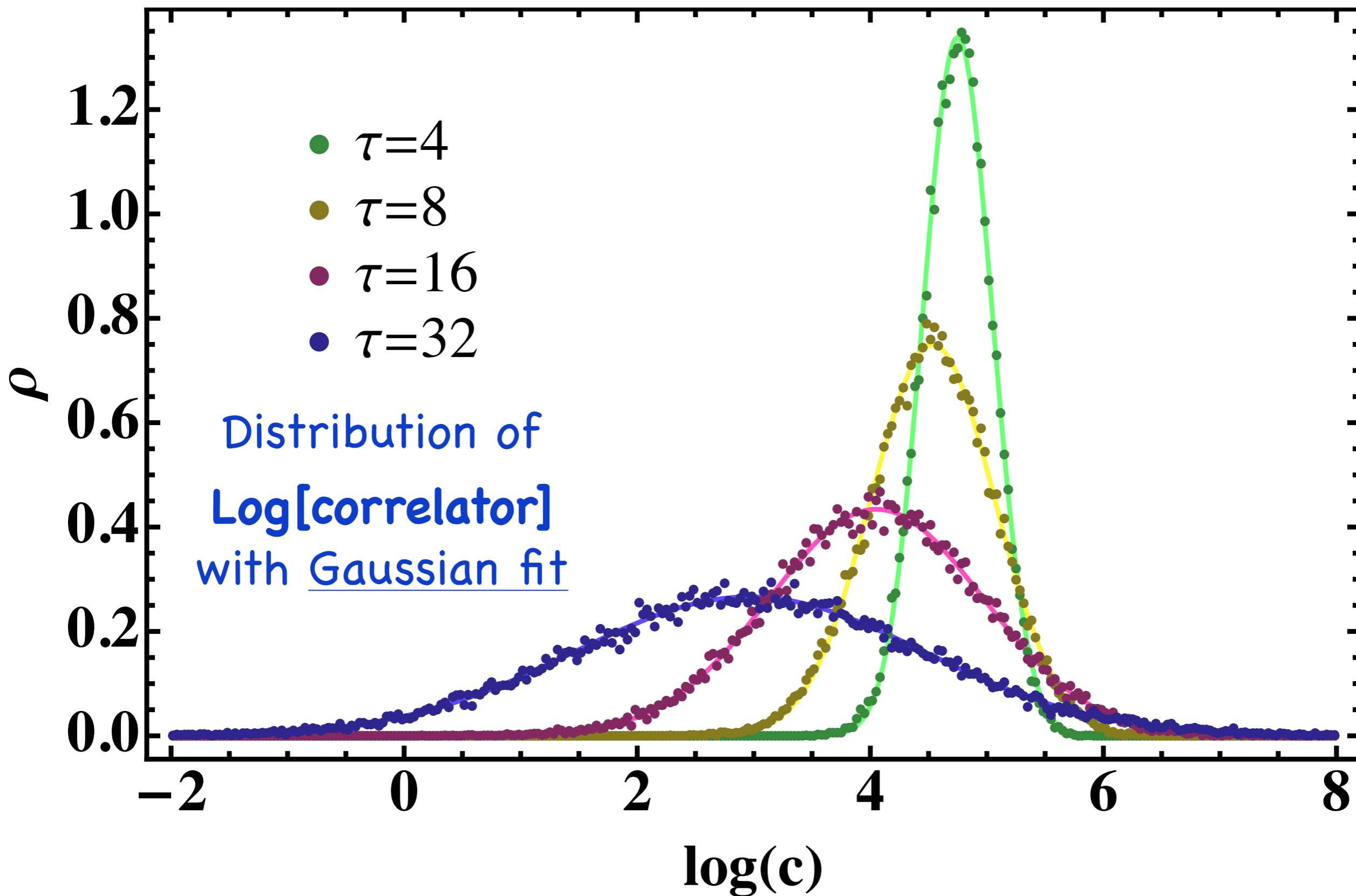
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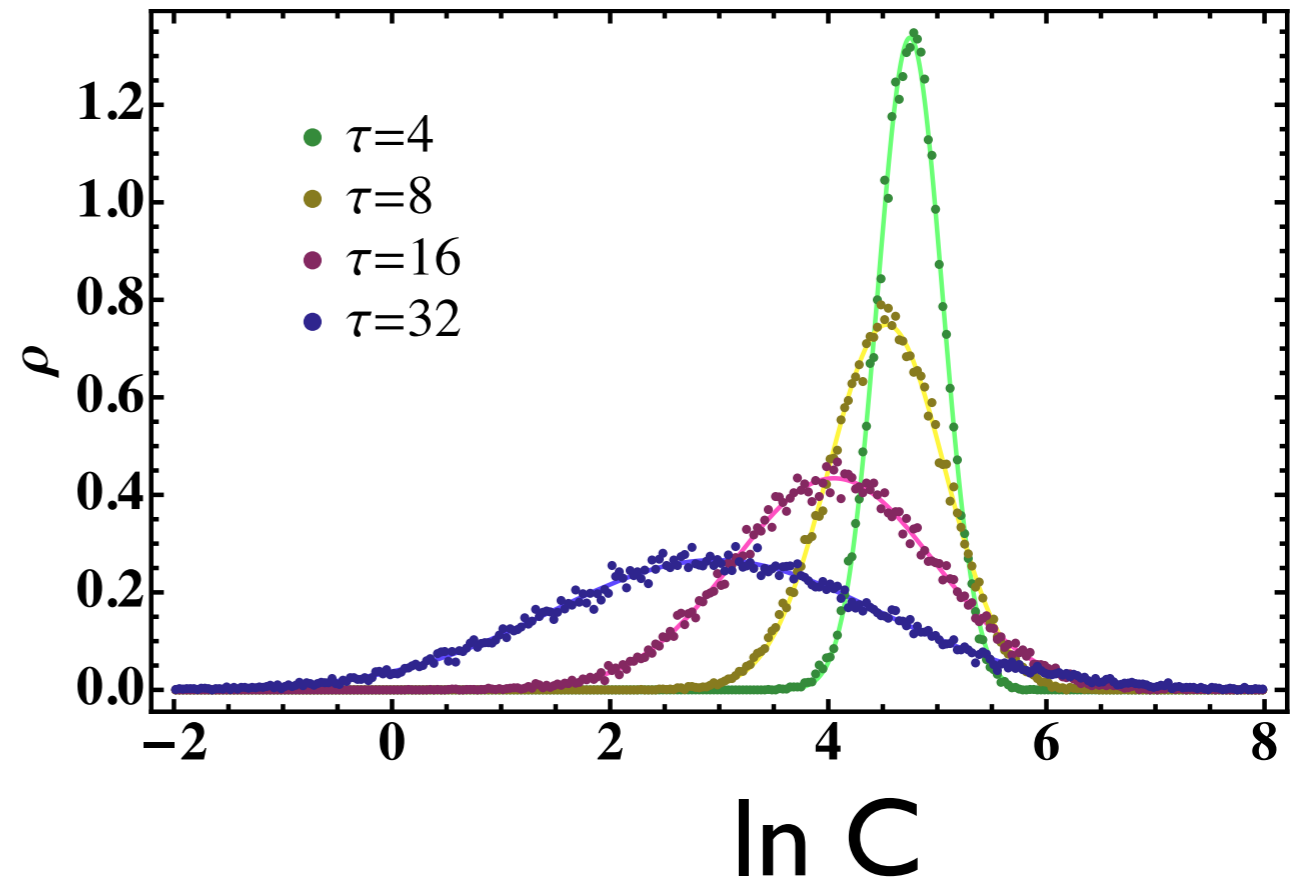
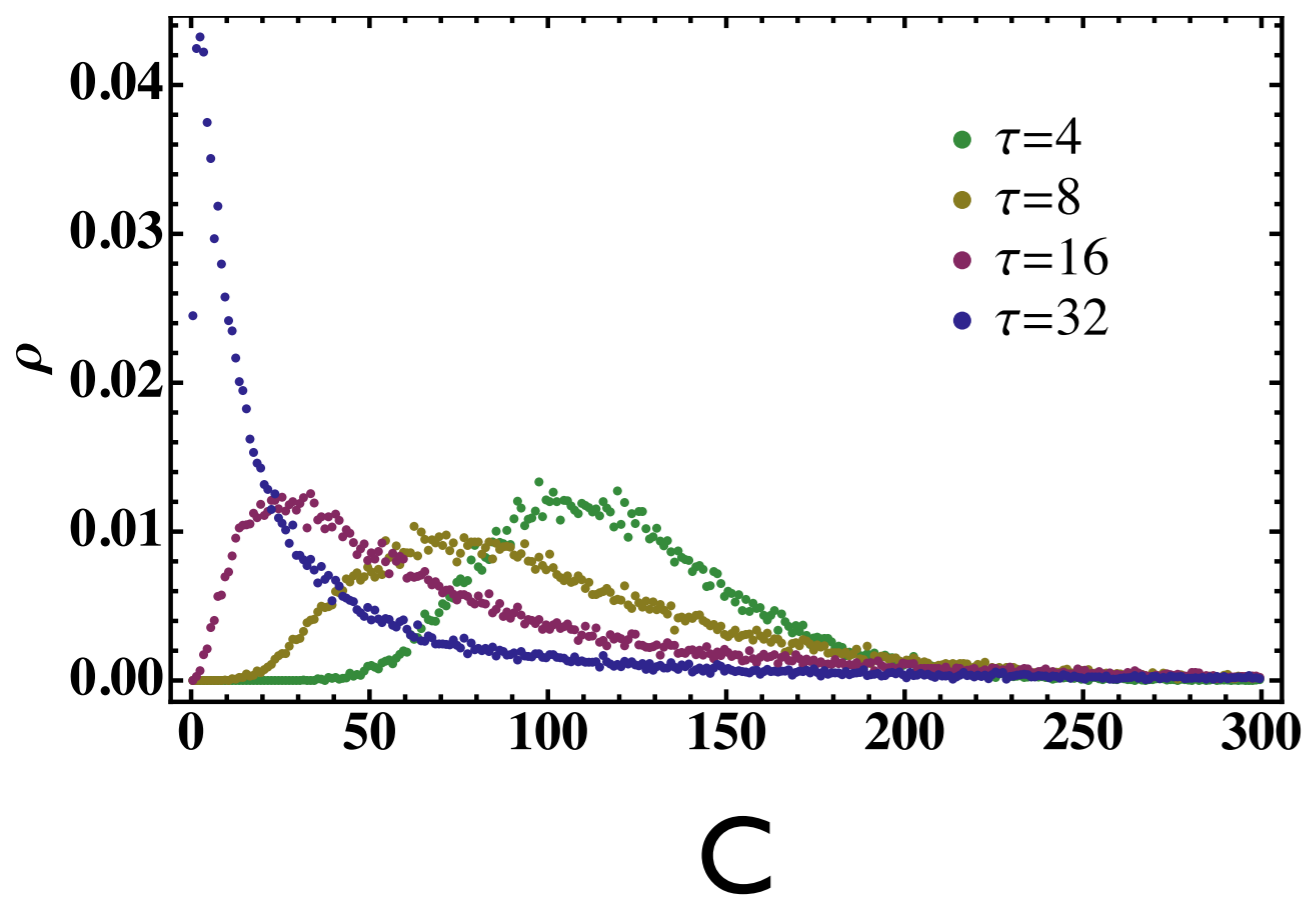
**Is there any  
information here?**

# Look at raw correlator probability distributions:

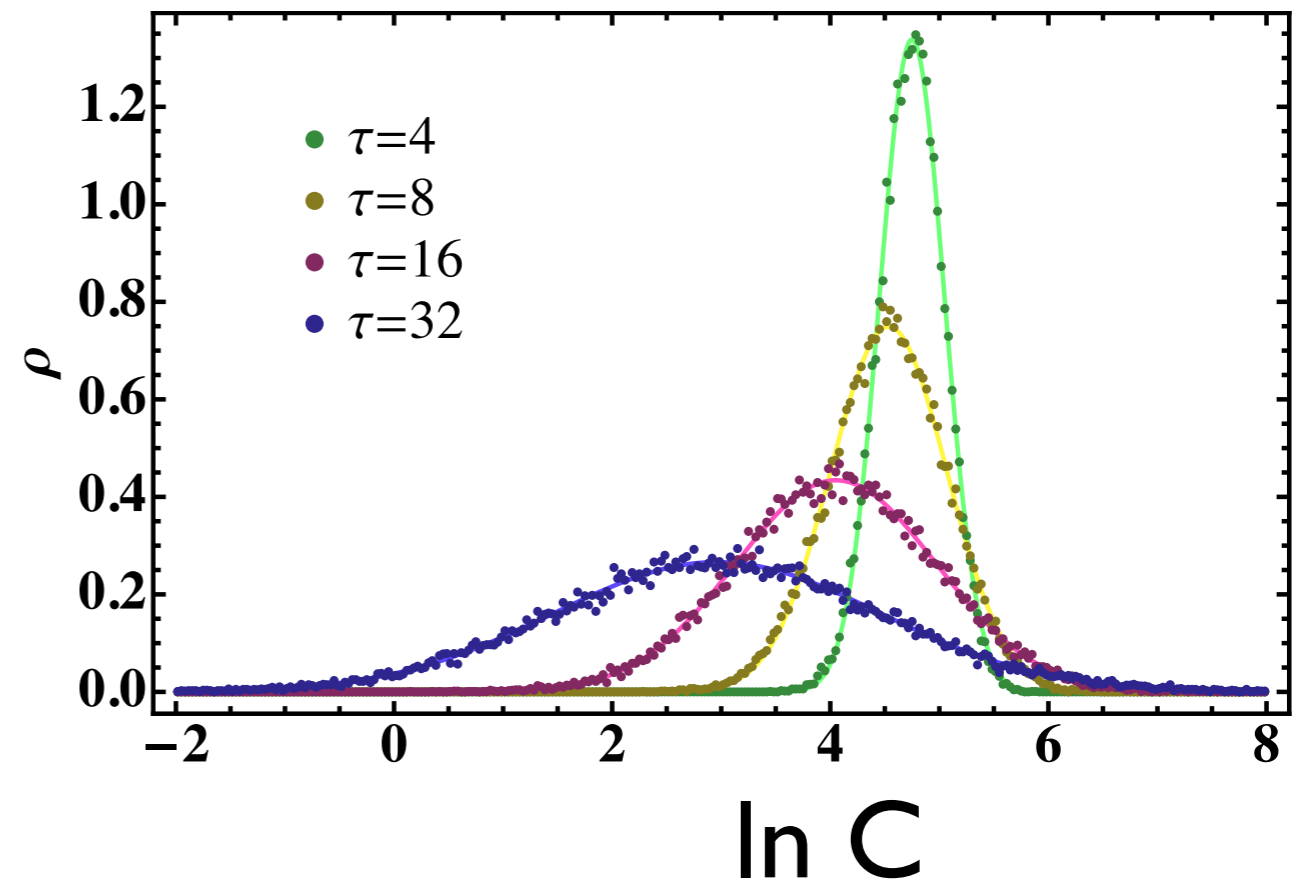
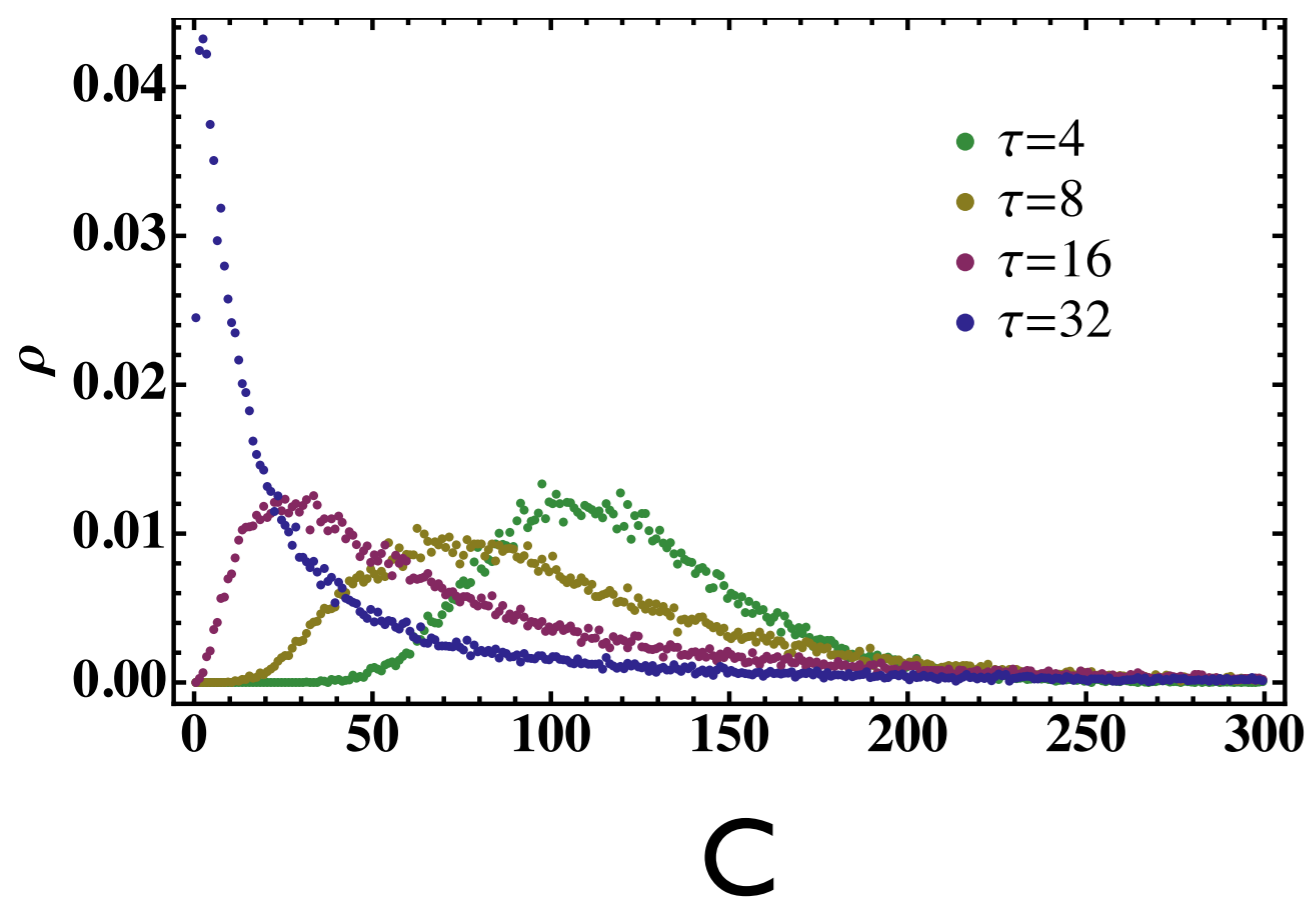


...but look at distribution for LOG of correlator:









- Correlators seem to **flow** toward a log-normal distribution (which is described by only two parameters)
- Noise and drift in measurement due to problems sampling long tail for computing  $\langle C \rangle$
- “Universal” description, in RG sense?

# Digression: statistics & the RG

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Probability distribution:

$$P(x)$$

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Cumulant generating function:

$$\begin{aligned} -\ln \phi(t) &= t\langle x \rangle + \frac{t^2}{2} (\langle x^2 \rangle - \langle x \rangle^2) + \dots \\ &= \sum_{n=1}^{\infty} \frac{t^n}{n!} \kappa_n \end{aligned}$$

# Digression: statistics & the RG

Analogue with  
path integral

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Like effective  
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$$= \sum_{n=1}^{\infty} \frac{t^n}{n!} k_n$$

$k_n$

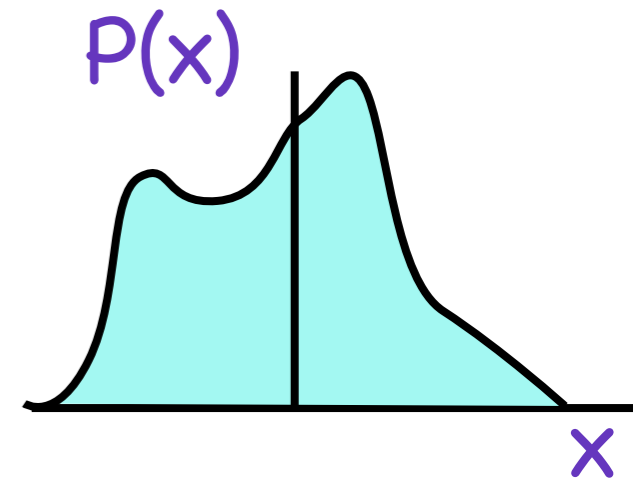
$n^{\text{th}}$  cumulant - like  $n$ -pt.  
operators in effective action,  
increasing dimension

## The Central Limit Theorem as RG flow

$P(x)$  = some probability distribution with zero mean, unit variance.

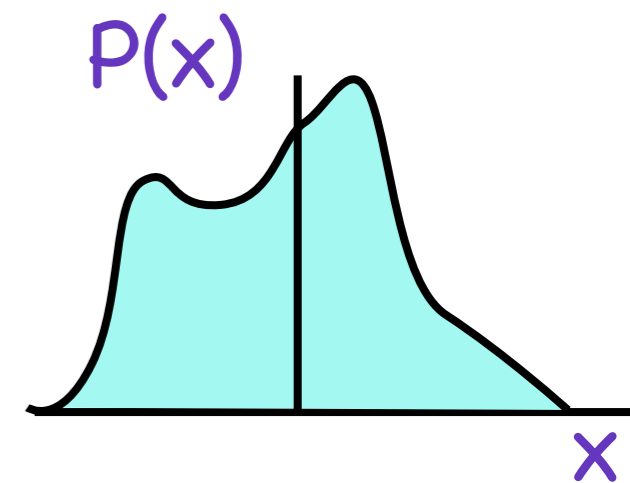
Characterize by cumulants:

$$P(0, 1, \kappa_3, \kappa_4, \dots; x)$$



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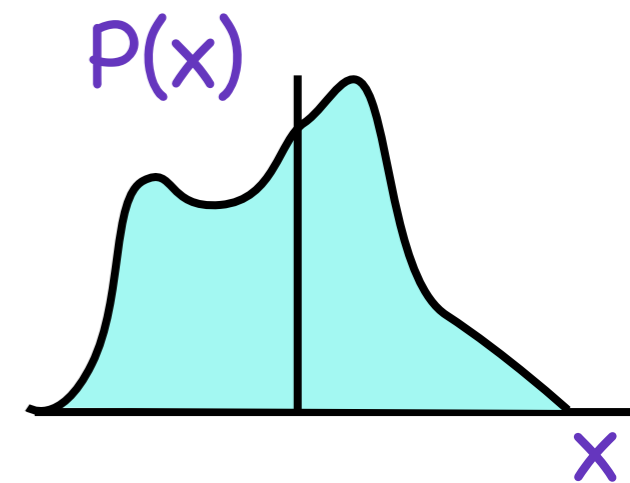
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Average pairwise:  
(and rescale)

$$y_1 = \frac{x_1 + x_2}{\sqrt{2}}, \quad y_2 = \frac{x_3 + x_4}{\sqrt{2}}, \dots$$

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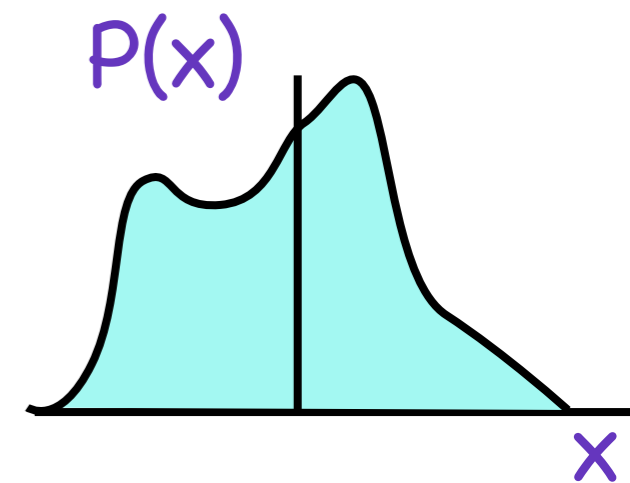
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$$\kappa_n \rightarrow 2^{(1-n/2)} \kappa_n$$

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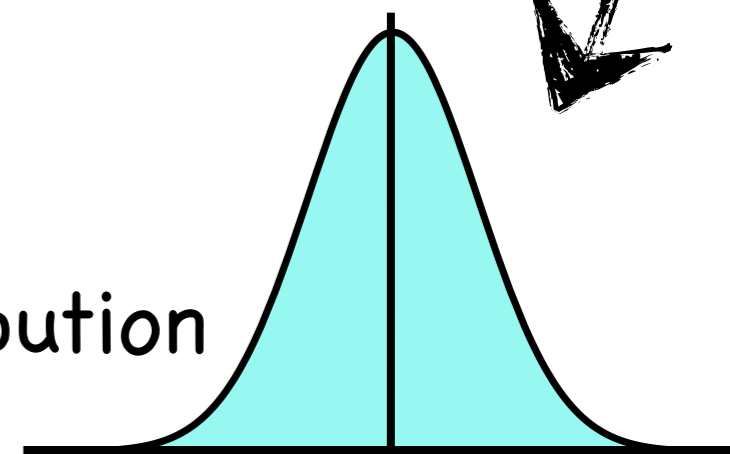
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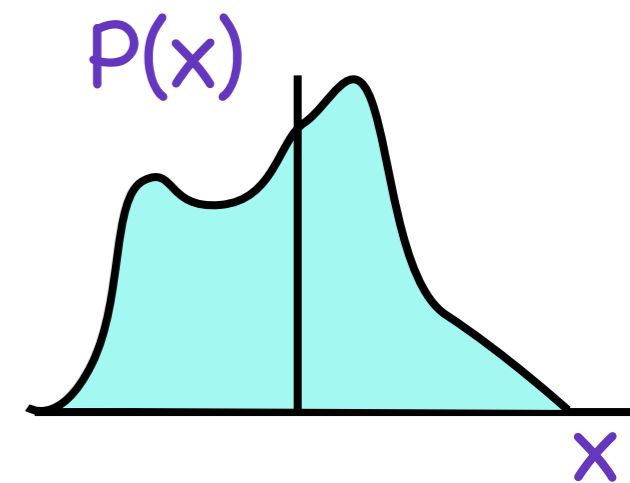
Repeat:  $P \Rightarrow P(0, 1, 0, 0, \dots; x)$

... **P flows** to normal distribution



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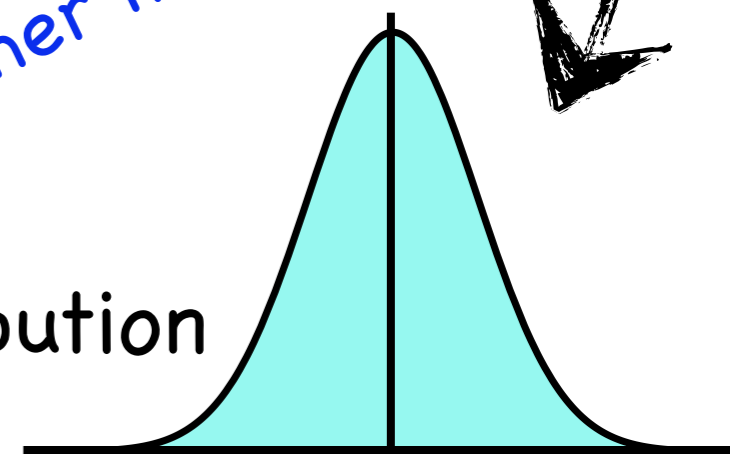
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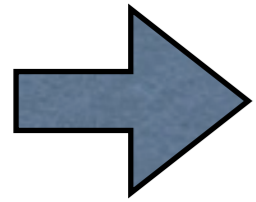
Repeat:  $P \Rightarrow P(0, 1, 0, 0, \dots; x)$

mean is relevant  
variance is marginal  
higher n: irrelevant

...  $P$  flows to normal distribution



In our case: correlator  $C(\Phi)$  driven toward log-normal distribution  
(BEFORE AVERAGING OVER  $\Phi$ )

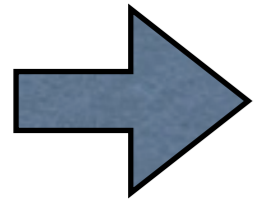


$\log[C(\Phi)]$  driven toward normal distribution

If cumulants  $\kappa_n$  of  $\log[C(\Phi)]$  behave as irrelevant operators, is there the equivalent of an effective field theory approach?




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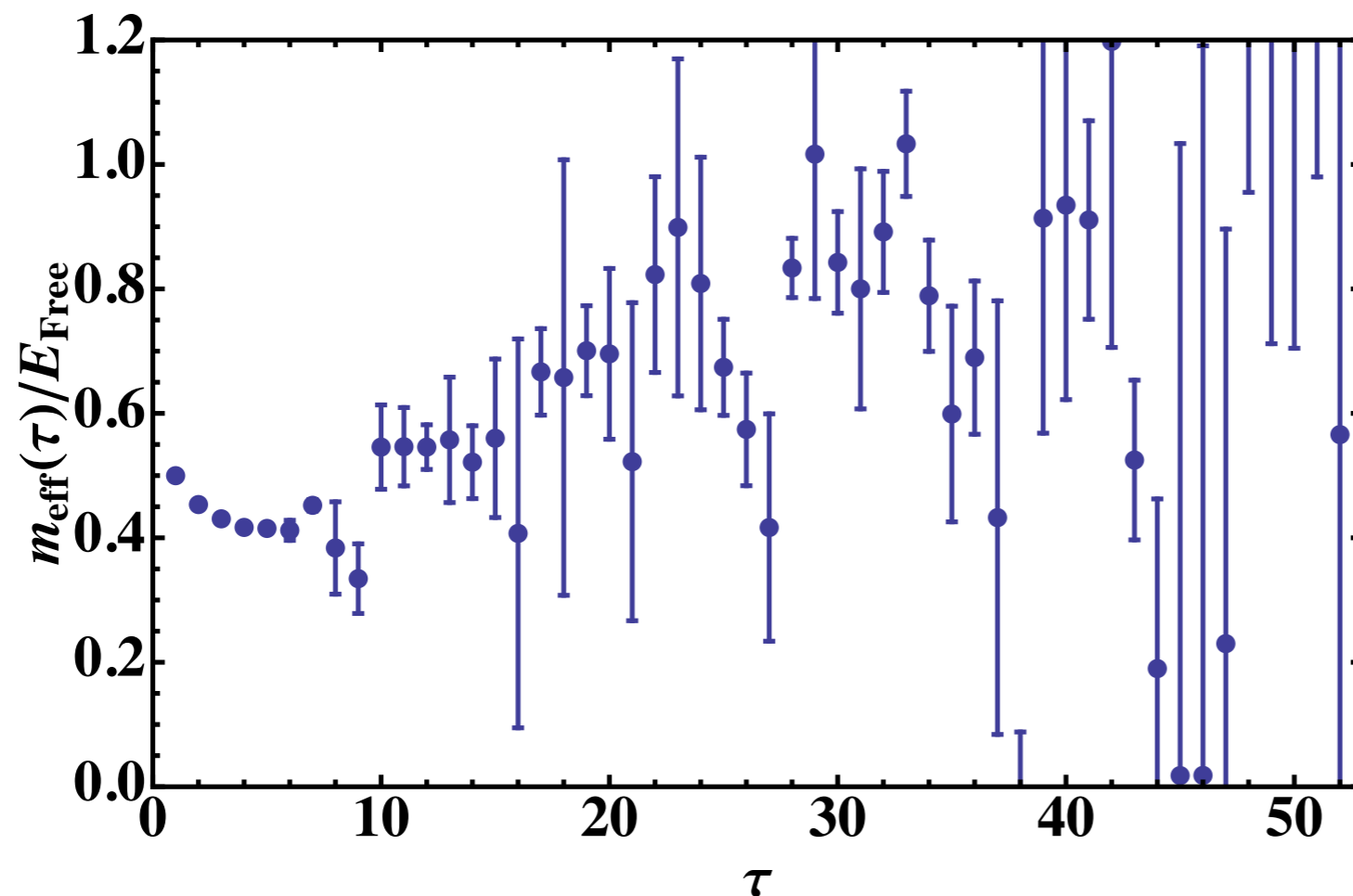
If cumulants  $\kappa_n$  of  $\log[C(\Phi)]$  behave as irrelevant operators, is there the equivalent of an effective field theory approach?

YES, truncate exact relation:  $\ln\langle C \rangle = \sum_{n=1}^{\infty} \frac{\kappa_n}{n!}$    
cumulants of  $\ln C$

$\kappa_n$  are computed from finite sample.

Back to real data for N=46 unitary fermions (40 M configs.)

Conventional effective mass plot  
already shown:

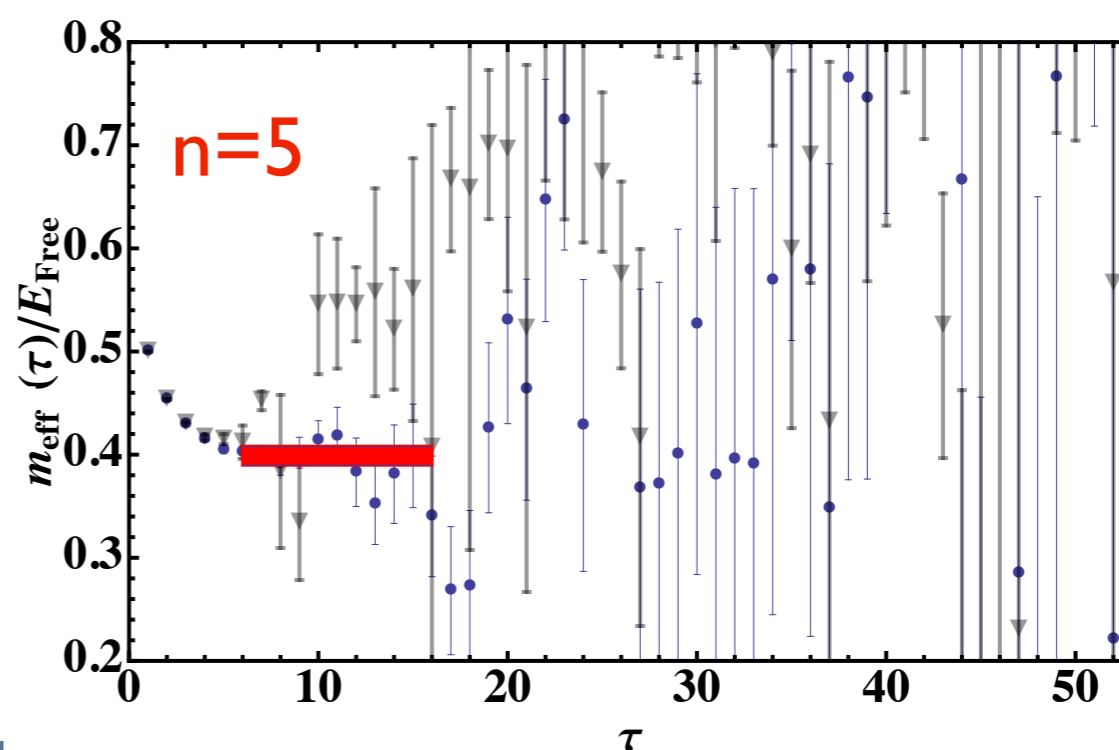
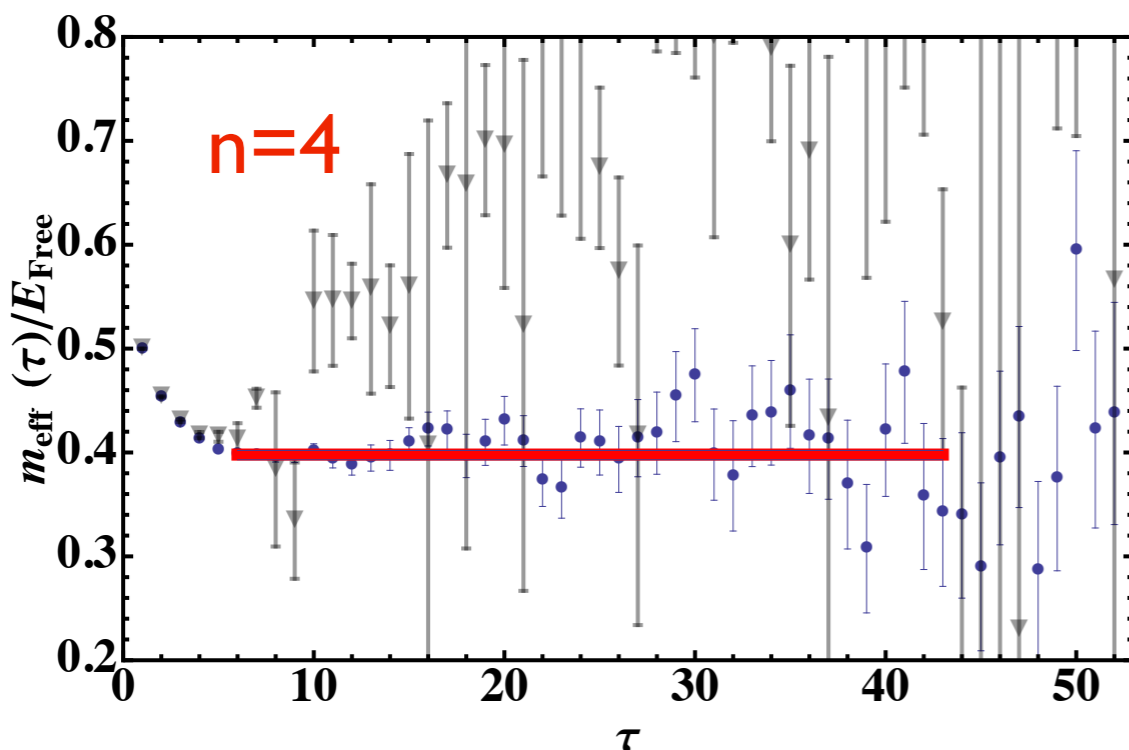
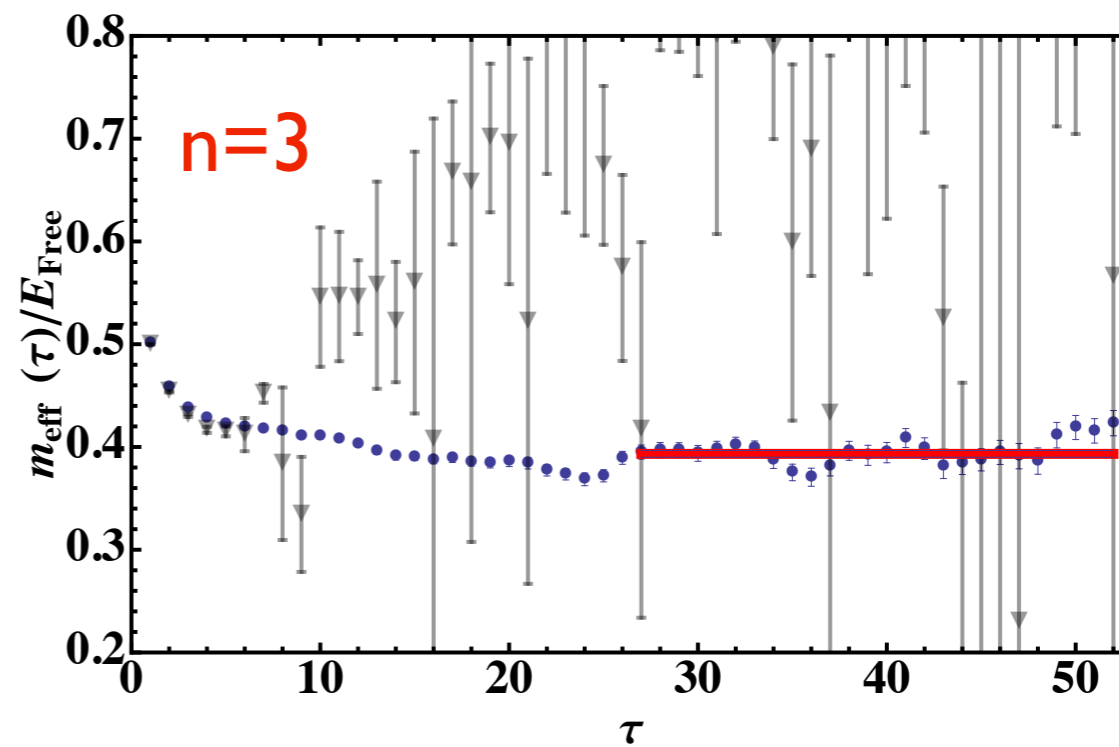
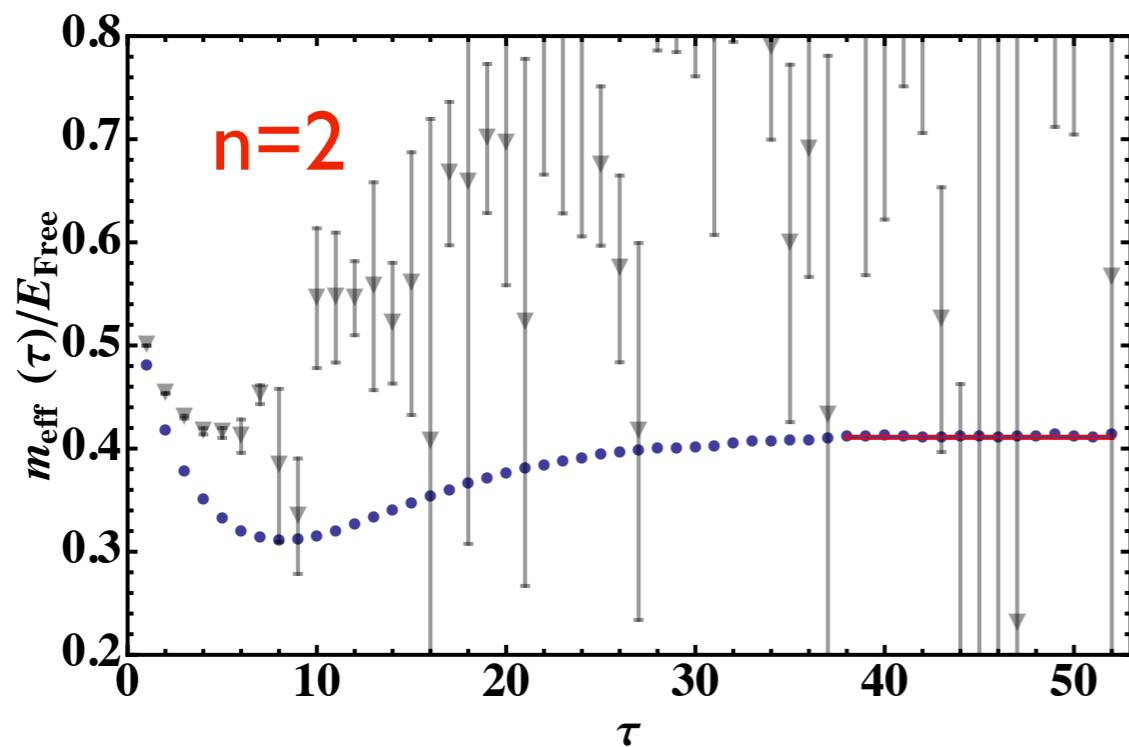


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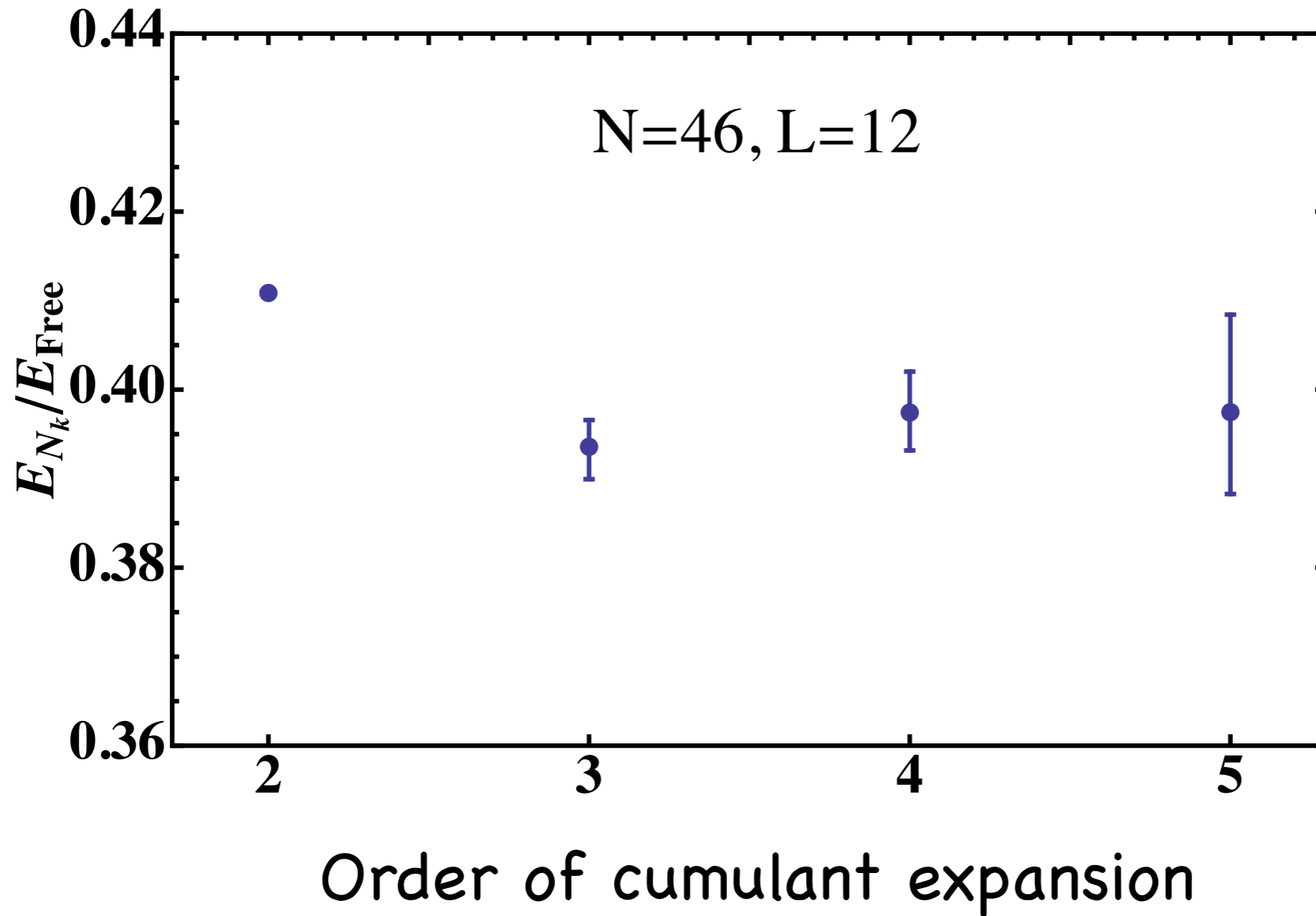
# Applying the cumulant expansion for the same data

- conventional effective mass plot (gray)
- cumulant expansion (blue) to order  $n$

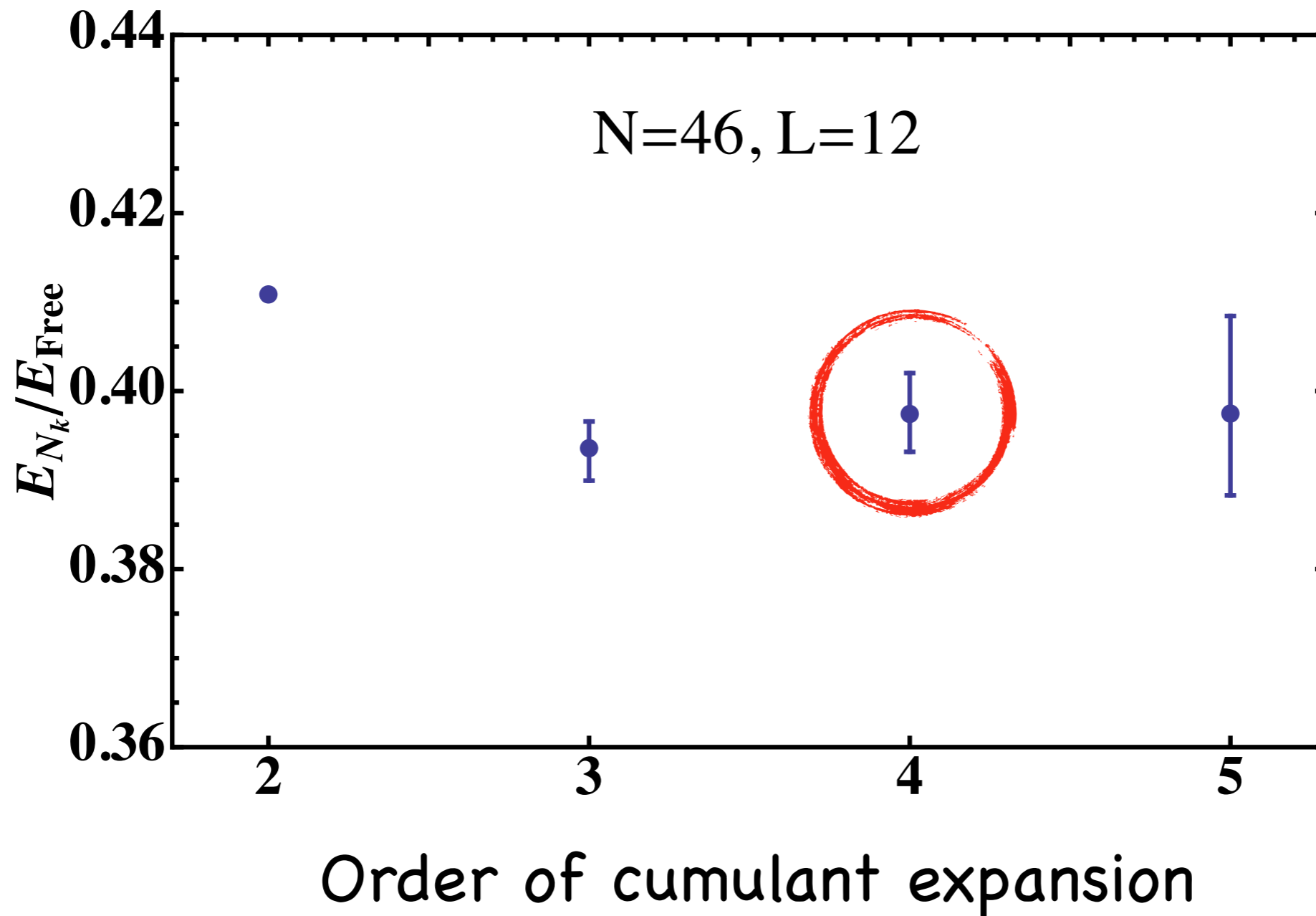
$$\ln\langle C \rangle = \sum \frac{\kappa_n}{n!}$$



# Determination of ground state energy for $N=46$ from cumulant expansion of $\log[C]$



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Why do almost log-normal distributions arise?

Typically, multiplicative stochastic processes.

- Fracturing of materials
- Flow of oil through porous rock
- ...

Similar physics in electron propagation in random media

Try mean field treatment for probability distribution  
(inspired by Smolyarenko, Altschuler, 1997)

Mean field argument: distribution for  $y = \text{Log}[C_N(\Phi, T)]$

N particle  
correlator



time separation T



$$P(y) = \int [D\phi] e^{-\int d^4x \frac{1}{2} m^2 \phi^2} \delta(\ln C_N[\phi, T] - y)$$

Mean field argument: distribution for  $y = \text{Log}[C_N(\Phi, T)]$

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correlator

time separation T

$$P(y) = \int [D\phi] e^{-\int d^4x \frac{1}{2} m^2 \phi^2} \delta(\ln C_N[\phi, T] - y)$$

Perform semiclassical expansion in  $\Phi$ .



Mean field argument: distribution for  $y = \text{Log}[C_N(\Phi, T)]$

N particle  
correlator



time separation T



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Perform semiclassical expansion in  $\Phi$ .

Leading order result:

- Log Normal distribution (with corrections at higher order);
- $\mu, \sigma^2$  scale with N and T as seen in data

## A wild west computation of $P(y)$

$$\begin{aligned} P(y) &= \int [D\phi] e^{-\int d^4x \frac{1}{2} m^2 \phi^2} \delta(\ln C_N[\phi, T] - y) \\ &= \int [D\phi] \int \frac{dt}{2\pi} e^{it \ln[C_N[\phi, T] - y] - \int d^4x \frac{m^2}{2} \phi^2} \end{aligned}$$

Find stationary point w.r.t.  $\{T, \Phi\}$ , assume constant  $\Phi$

- What is  $m$ ? renormalized!
  - Power divergent subtraction scheme ( $\lambda$ =ren. scale):

$$m^2 = \frac{M\lambda}{4\pi} \longrightarrow \frac{Mk_F}{4\pi} \qquad \frac{N}{V} = \frac{k_F^3}{6\pi^2}$$

- What is variation of  $\ln[C]$  wrt  $\Phi$ ?

$$P(y) = \int [D\phi] \int \frac{dt}{2\pi} e^{it \ln[C_N[\phi, T] - y] - \int d^4x \frac{m^2}{2} \phi^2}$$

Need: 
$$\left. \frac{\partial \ln[C_N[\phi, T] - y]}{\partial \phi} \right|_{\phi(x) = \phi_0}$$

$$C_N[\phi_0, T] \sim \langle 0 | [\psi(T)]^N [\psi(0)]^N | 0 \rangle_{\phi_0} \sim Z e^{-E_0(\phi_0, N)T}$$

$\Phi$  couples to  $\Psi^\dagger \Psi$  on time link = current density...so  $\Phi_0$  looks like a constant vector potential.

$$E_0(\phi_0, N) = 2(E_N + N\phi_0) , \quad E_N = \frac{3Nk_F^2}{10M}$$

So easy to find stationary point eqs:

$$t \rightarrow t_0 = -i \frac{Vm^2 \phi_0}{N}$$

$$\phi \rightarrow \phi_0 = \frac{y - \ln Z + TE_0(N)}{NT}$$

Plug back in and find the probability distribution for  $y = \ln[C_N]$ :

$$P(y) \propto e^{-(y-\bar{y})^2 / 2\sigma^2},$$

$$\bar{y} = \ln Z - TE_0(N)$$

$$\sigma^2 = \frac{40}{9\pi} TE_0(N)$$

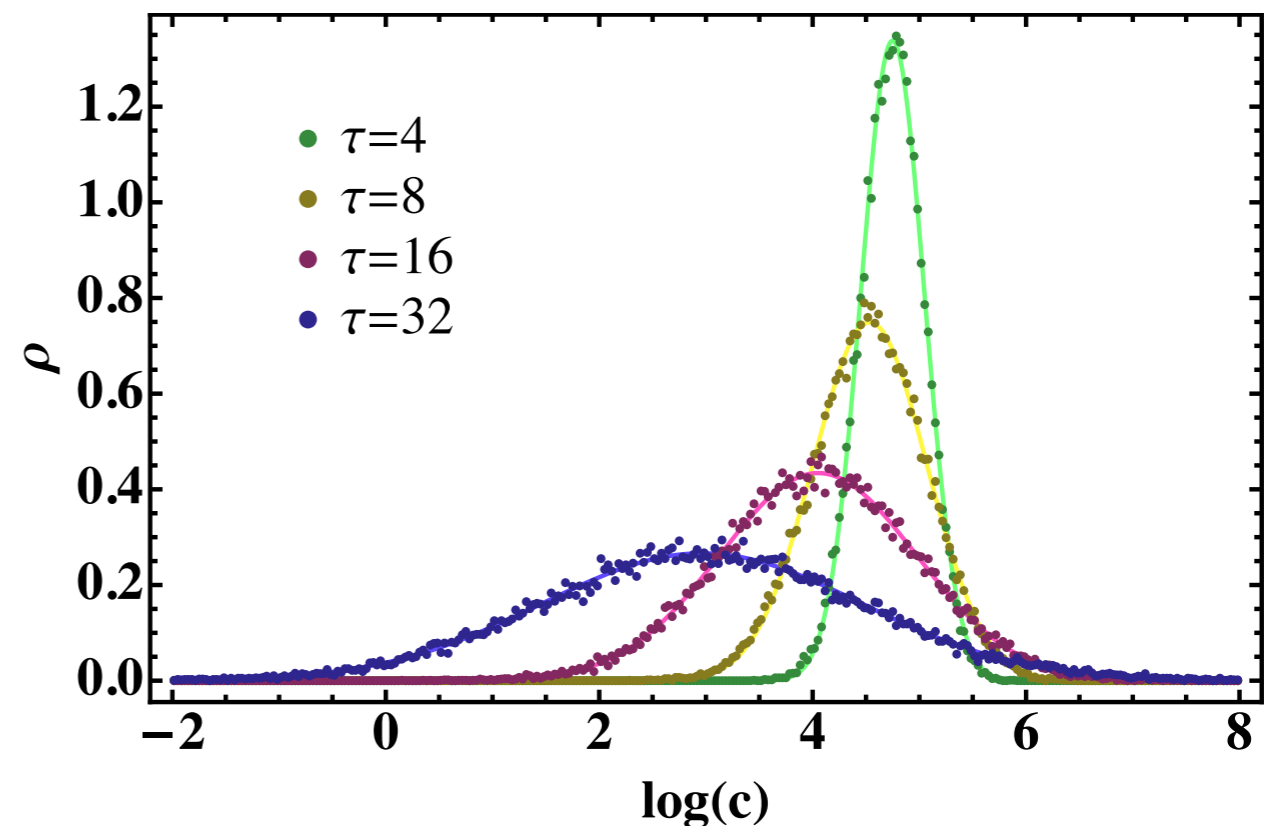
Log normal dist. for  $C_N$ !  
Mean grows linearly in  $T$   
Variance grows linearly in  $T$

Didn't compute fluctuations...so not really renormalized

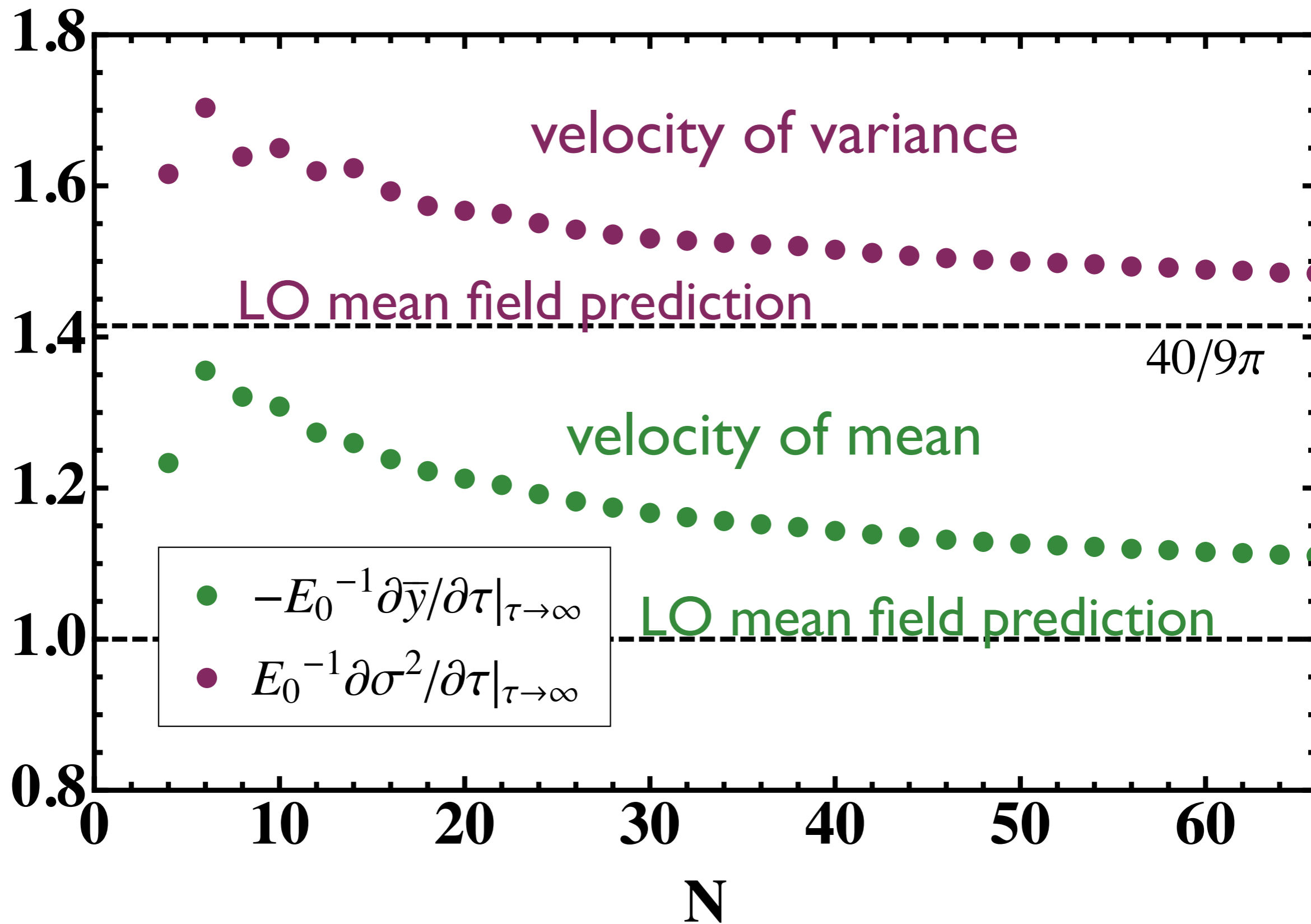
No obvious justification for semiclassical "expansion".

Result fits qualitatively:

- Explains log normal
- Mean and variance do grow linearly with time



Is there quantitative agreement? Yes...



...also suggests mean field might become exact for large N?

## Directions to go:

- Understand phenomenon better

Implications for spectrum? see:

Amy Nicholson

N-body Efimov states from two-particle noise

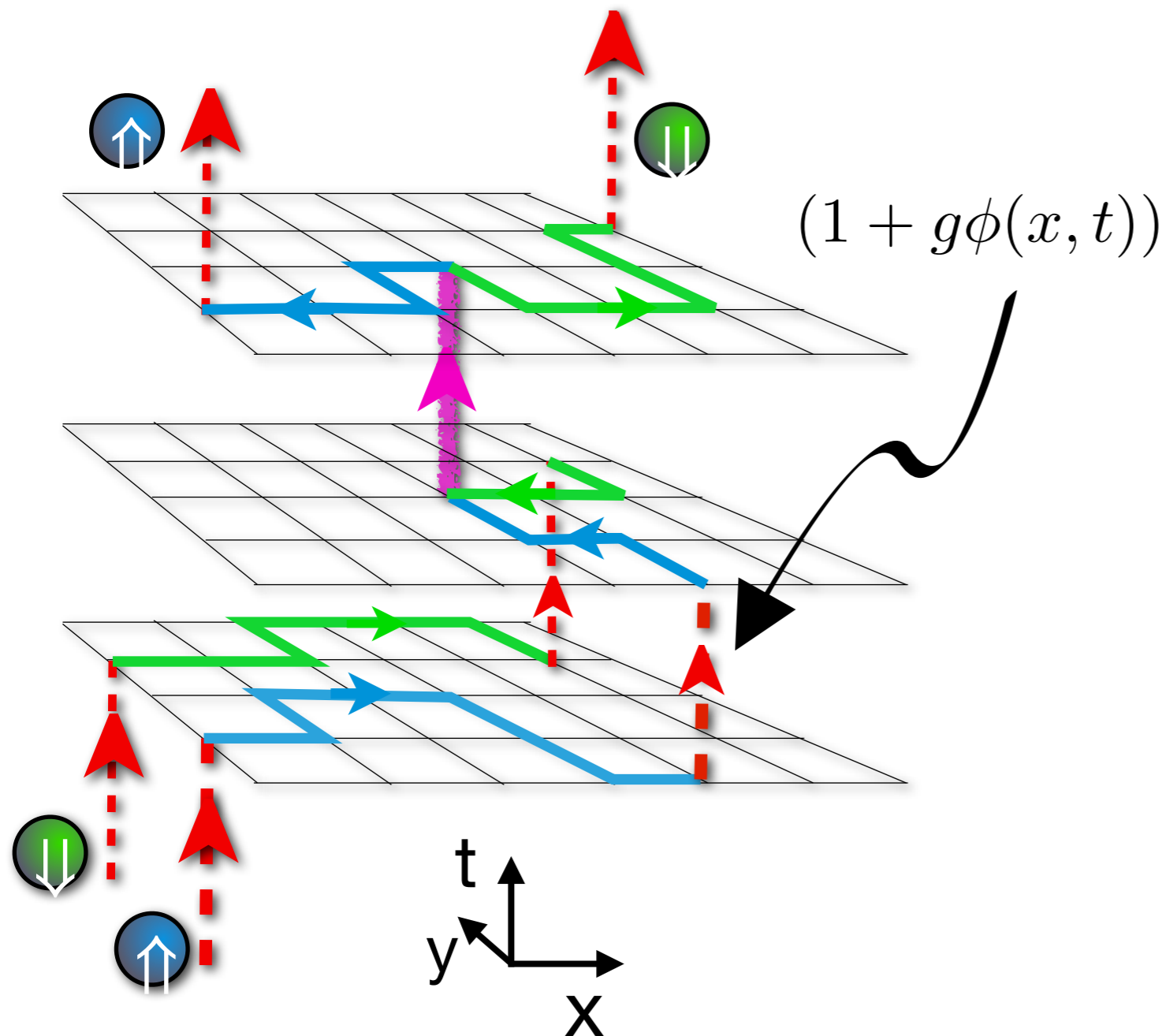
[arXiv:1202.4402](https://arxiv.org/abs/1202.4402)

- Study toy model
- Does understanding = better approach to noise in unitary fermion calculations?
- Can we make a leap to QCD?

Useful to have an analytically soluble toy model:  
1 particle, one spatial site

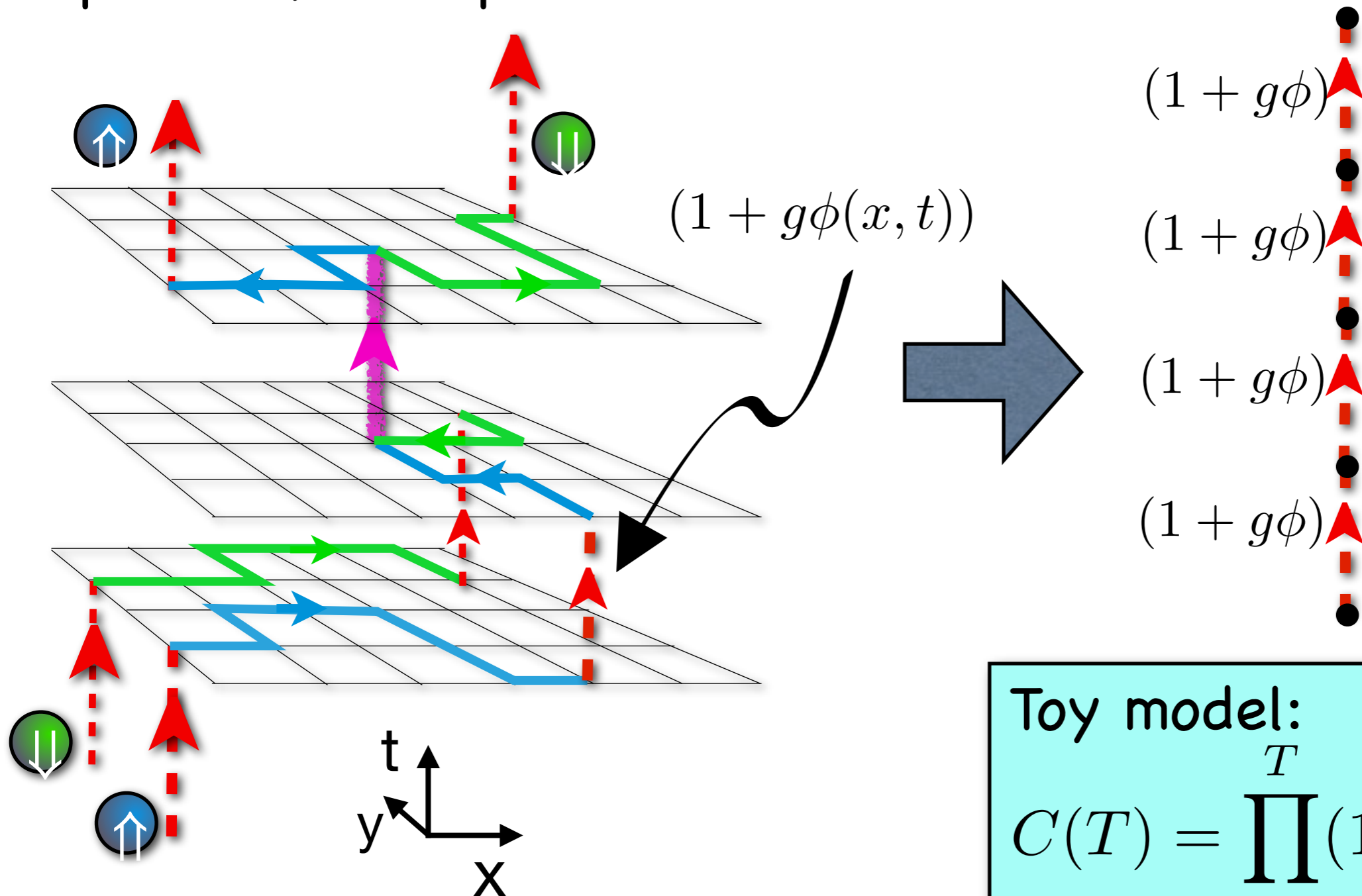


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$\phi_i \in [-1, 1]$  uniform dist.

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$$E(T) \equiv -\frac{1}{T} \ln \langle C(T) \rangle_{\phi} = 0$$

Compare with simulation (finite sample size),  $g=1/2$

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Two strategies:

- Conventional:  $E \rightarrow -\frac{1}{T} \ln \left[ \frac{1}{N} \sum_{i=1}^N C(T, \phi_i) \right]$

- New "EFT" approach: use identity

$$\ln \langle C \rangle = \sum_n \frac{\kappa_n}{n!} \quad \kappa_n = \text{cumulants of } \ln C(T, \phi)$$

estimate  $\kappa_n$  from sample for low  $n$ .

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$\kappa_n = 0$  for  $n > 2$  if distribution is exactly log normal

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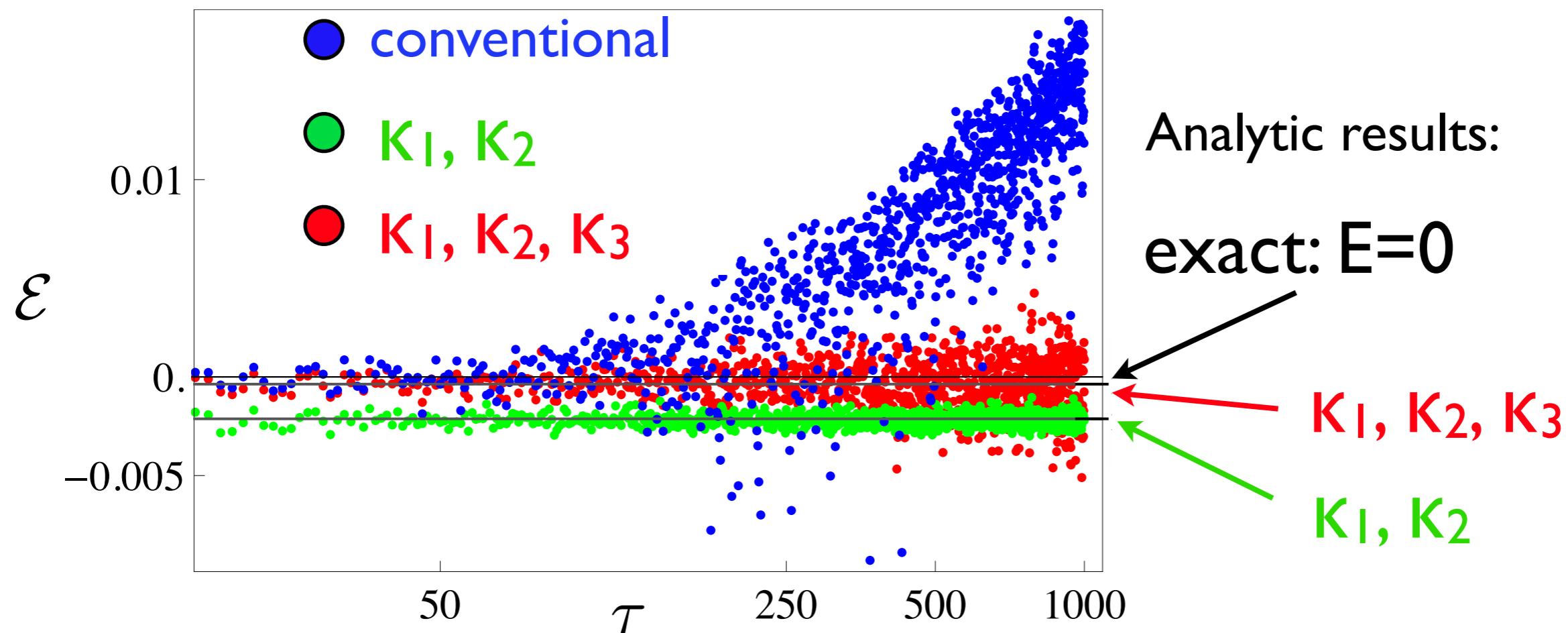
Can compute cumulants of  $(\ln C)$  analytically:

$$\begin{aligned} \kappa_1 &= \tau \left[ \frac{1}{2} \log(1 - g^2) + \frac{\tanh^{-1}(g)}{g} - 1 \right], \\ \frac{\kappa_n}{n!} &= \tau \left( \frac{(-1)^n}{n} - \text{Li}_{1-n} \left( \frac{1+g}{1-g} \right) \frac{(2 \tanh^{-1}(g))^n}{n!} \right) \quad \mathbf{n > 1} \end{aligned}$$

# Effective mass plot for toy model

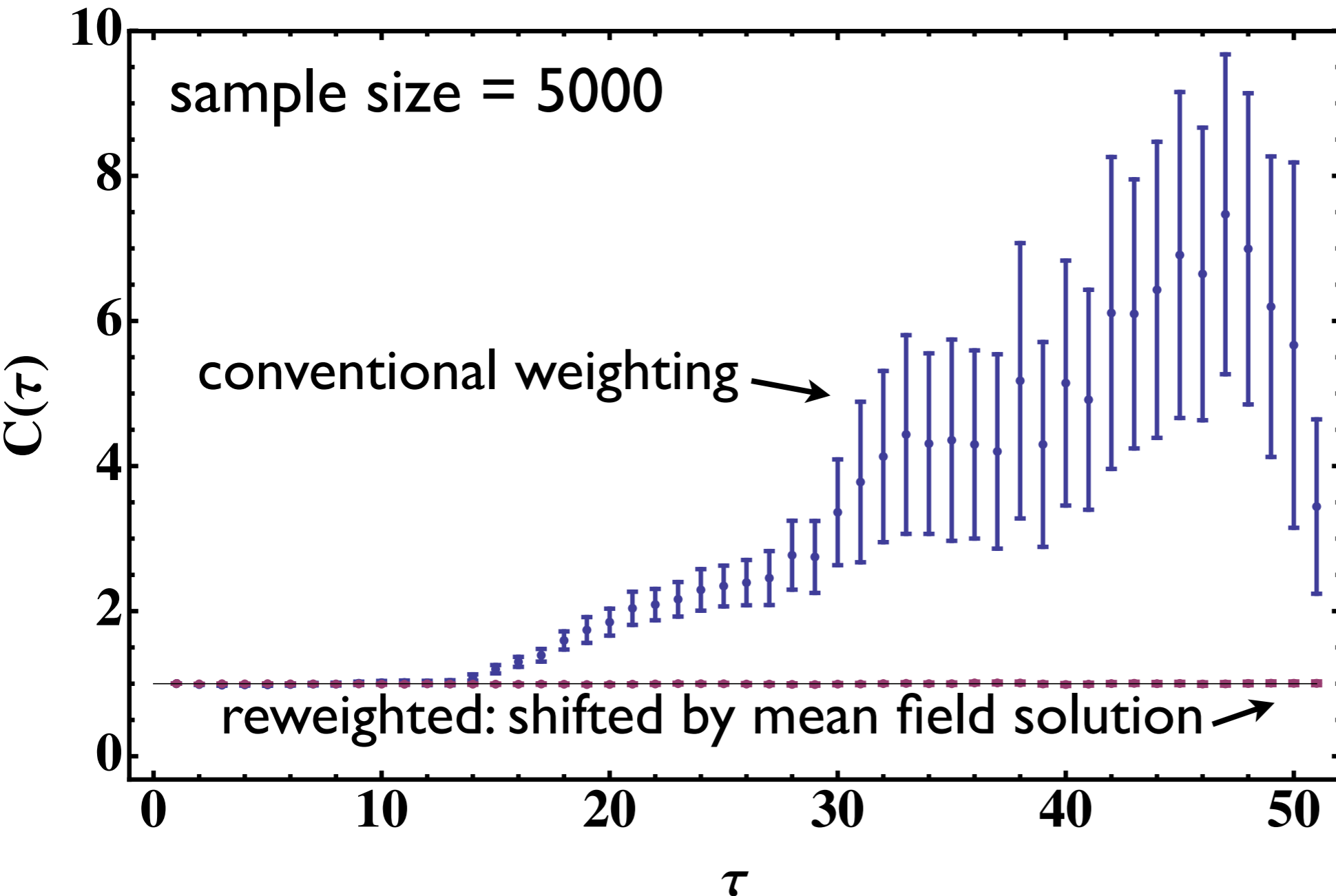
Simulation: sample size  $N=50,000$   
(each dot)

Spread & drift  
= simulation errors



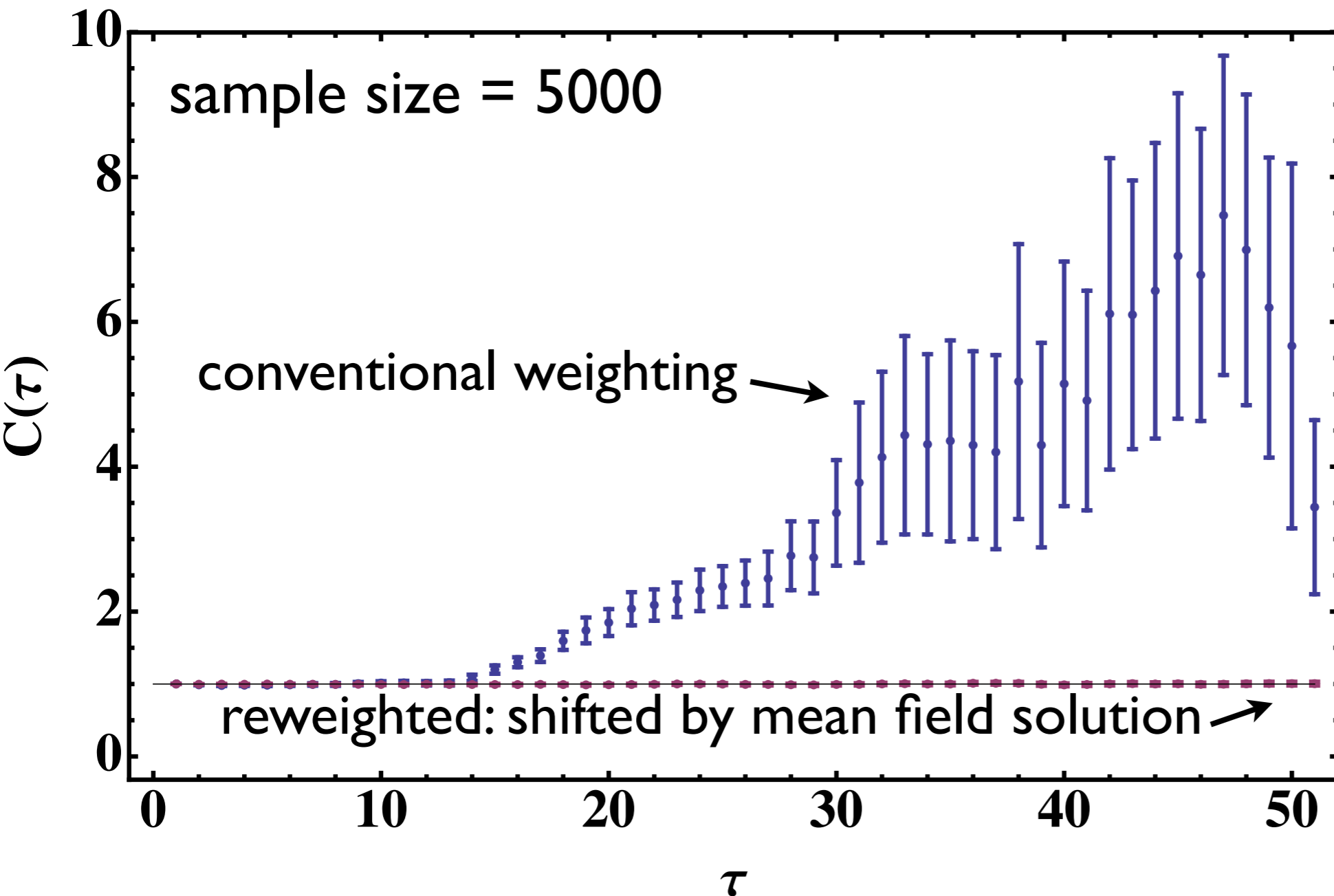
We see same phenomenon as in real simulation, but here have analytic results to compare with

Intriguing observation about toy model:  
improvement if reweighted by mean field solution  
(Endres)





Intriguing observation about toy model:  
improvement if reweighted by mean field solution  
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Model too  
simplistic

...but is there  
some  
way to use m.f.t.  
to reweight a real  
field theory?

Are distributions approaching log-normal appearing in QCD?

Apparently yes, at early time, although time dependence seems to be different

NPLQCD data

distribution of  $\log C_{\Lambda\Lambda}$

Each curve: 100,000 samples

SORRY - THIS FIGURE IS LOST IN PDF VERSION

...But at late time we do not expect log normal for baryon propagators in QCD

Lepage (& Savage):

$$x \equiv \text{Re}[C_{A \times 3q}(T)]$$

Real part of Euclidian correlator for  
A baryons

$$\langle x^{2k} \rangle \sim e^{-A3kM_\pi T}$$

$$\langle x^{2k+1} \rangle \sim e^{-AM_N T} e^{-A3km_\pi T}$$

Odd moments die out faster...expect almost symmetric distribution at late time

Do heavy-tailed non-gaussian distributions occur in lattice QCD? Probably, especially large baryon number

time-slice = 0

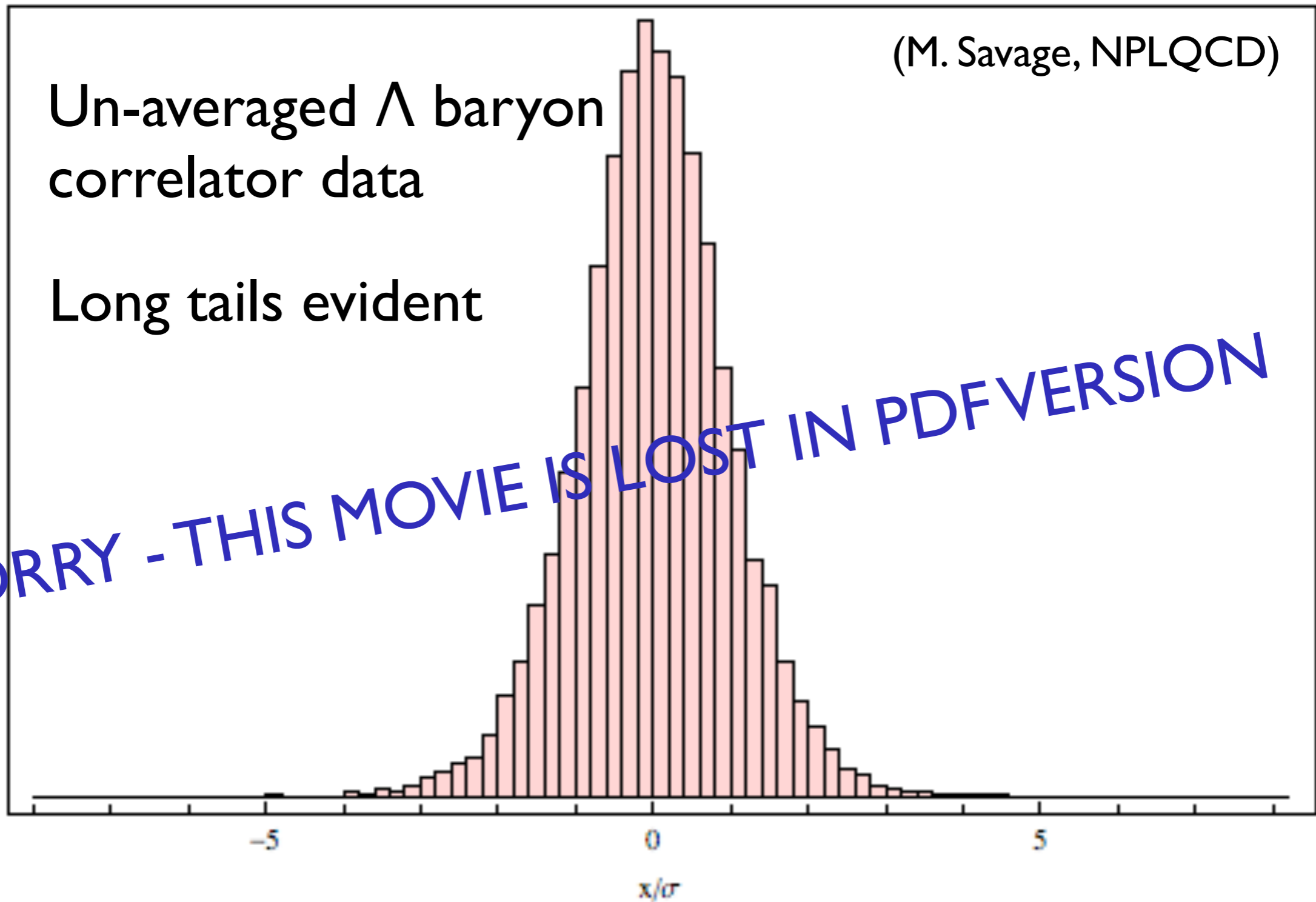
(M. Savage, NPLQCD)

Un-averaged  $\Lambda$  baryon correlator data

Long tails evident

Probability Density

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Evidence suggests:

- QCD baryon correlators exhibit log normal distribution at short time...but in this window, conventional plateau analysis works as well as cumulant expansion
- later time, non log normal, nearly symmetric distribution appears..."sign problem" manifestation

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Questions instead of conclusions:

- Does QCD correlator distribution have some universal structure, more complex than log normal?
- Would understanding such a distribution aid in extracting spectrum masses from the noise? (eg "EFT" analysis of noise)
- Is there a mean field approach in QCD that could shed light on what is going on?