

# Constructing worm-like algorithms from Schwinger- Dyson equations

Pavel Buividovich

(ITEP, Moscow and JINR, Dubna)

Humboldt University + DESY, 07.11.2011

# Motivation: Lattice QCD at finite baryon density

- Lattice QCD is one of the main tools to study quark-gluon plasma
- Interpretation of heavy-ion collision experiments: RHIC, LHC, FAIR,...

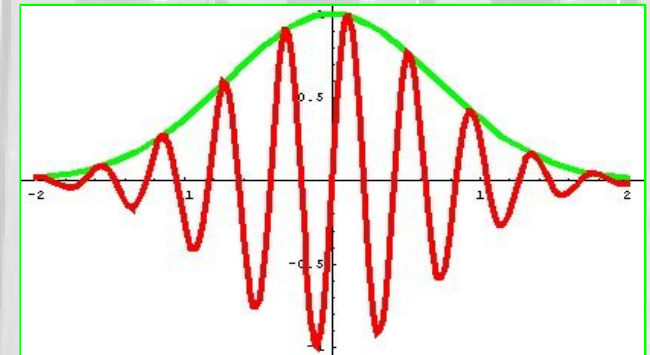
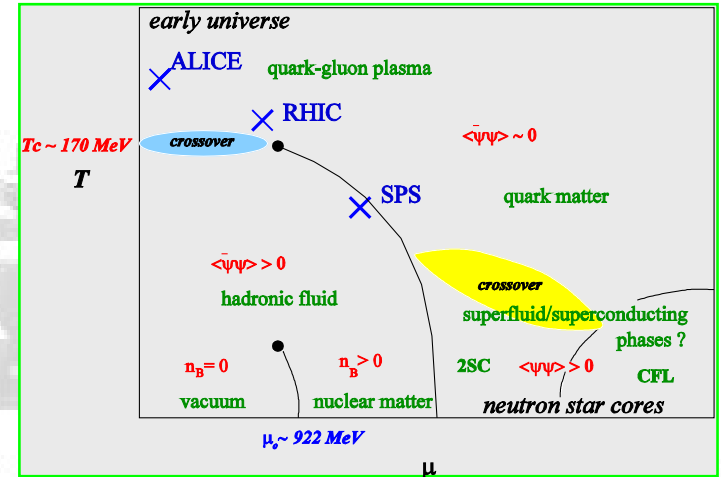
But: baryon density is finite in experiment !!!

Dirac operator is not Hermitean anymore

$\exp(-S)$  is complex!!! Sign problem

Monte-Carlo methods are not applicable !!!

Try to look for alternative numerical simulation strategies



# Lattice QCD at finite baryon density: some approaches

- Taylor expansion in powers of  $\mu$
- Imaginary chemical potential
- $SU(2)$  or  $G_2$  gauge theories
- Solution of truncated **Schwinger-Dyson** equations in a fixed gauge
- Complex Langevin dynamics
- Infinitely-strong coupling limit
- Chiral Matrix models ...

“Reasonable” approximations with unknown errors,

**BUT**

**No systematically improvable methods!**

# Path integrals: sum over paths vs. sum over fields

## Quantum field theory:

### Sum over fields

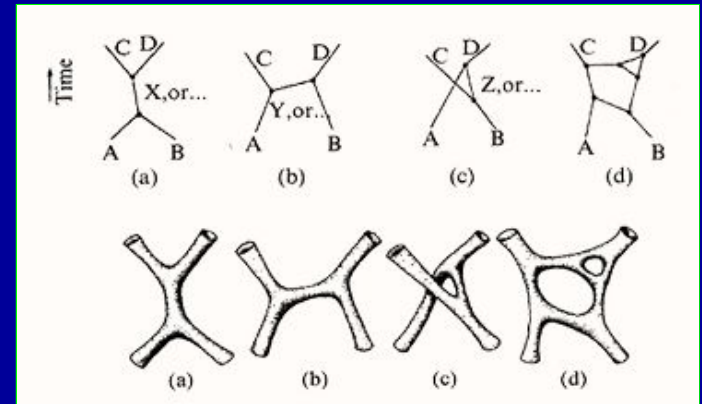


$$\mathcal{Z} = \text{Tr} e^{-\hat{\mathcal{H}}/kT} = \int \mathcal{D}\phi(x^\mu) \exp(-S_E[\phi(x^\mu)])$$

Euclidean action:

$$S_E = \int d^D x \left( \frac{1}{2} \partial_\mu \phi \partial_\mu \phi + \frac{m^2}{2} \phi^2 + V(\phi) \right)$$

### Sum over interacting paths

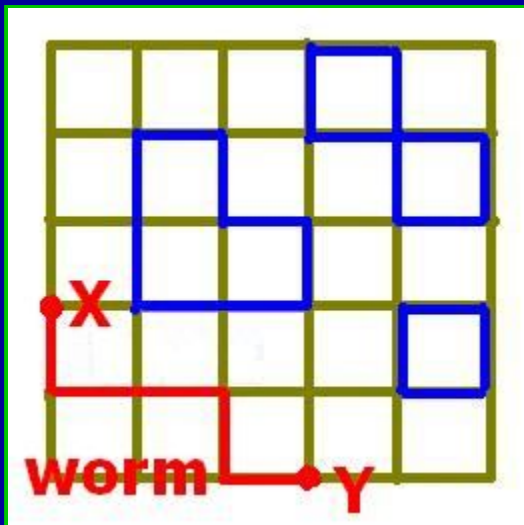


$$\mathcal{Z} = \sum_k \frac{\lambda^k}{k!} \exp(-L(\text{Paths connecting } k \text{ vertices}))$$

Perturbative expansions

# Worm Algorithm [Prokof'ev, Svistunov]

- Monte-Carlo sampling of closed vacuum diagrams:  
nonlocal updates, closure constraint
- Worm Algorithm: sample closed diagrams + open diagram
- Local updates: open graphs  $\longleftrightarrow$  closed graphs
- Direct sampling of field correlators (dedicated simulations)



$x, y$  – head and tail of the worm

$$\langle \sigma_x \sigma_y \rangle \sim p(x, y)$$

Correlator = probability distribution of head and tail




- Applications: systems with “simple” and convergent perturbative expansions (Ising, Hubbard, 2d fermions ...)
- Very fast and efficient algorithm!!!

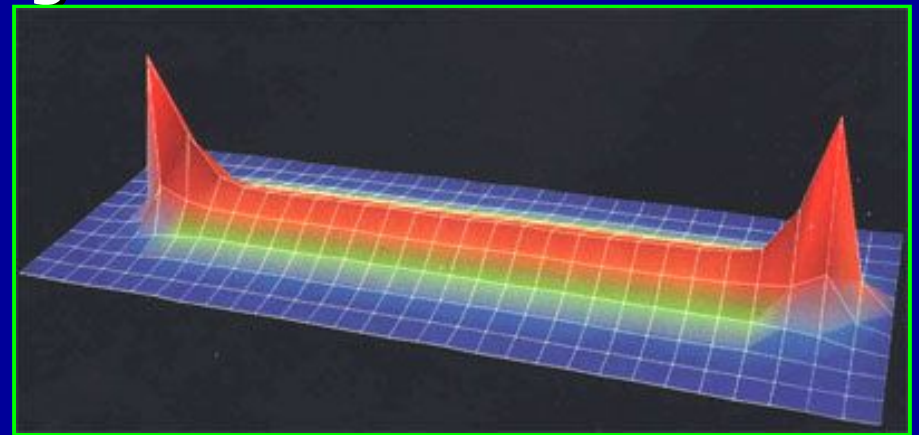
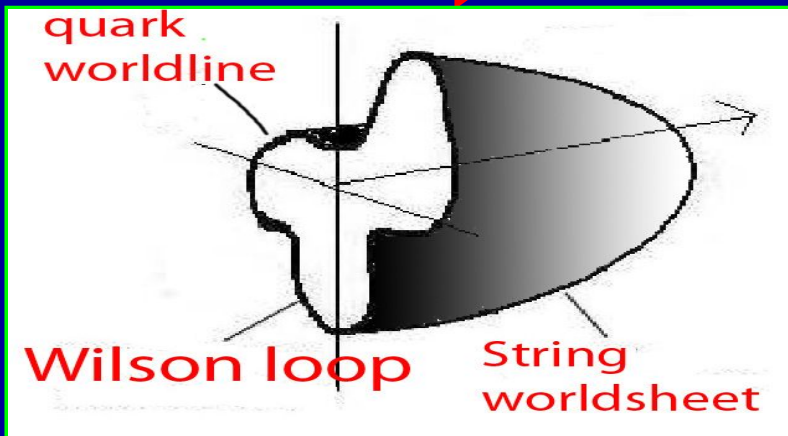
# Worm algorithms for QCD?

Attracted a lot of interest recently as a tool for  
QCD at finite density:

- Y. D. Mercado, H. G. Evertz, C. Gattringer, [ArXiv:1102.3096](#) – Effective theory capturing center symmetry
- P. de Forcrand, M. Fromm, [ArXiv:0907.1915](#) – Infinitely strong coupling
- W. Unger, P. de Forcrand, [ArXiv:1107.1553](#) – Infinitely strong coupling, continuous time
- K. Miura et al., [ArXiv:0907.4245](#) – Explicit strong-coupling series ...

# Worm algorithms for QCD?

- Strong-coupling expansion for lattice gauge theory: **confining strings** [Wilson 1974]
- Intuitively: **basic d.o.f.'s in gauge theories = confining strings** (also AdS/CFT etc.)
- **Worm**  something like "tube"



- **BUT: complicated group-theoretical factors!!!** Not known explicitly  Still no worm algorithm for **non-Abelian LGT** (Abelian version: [Korzec, Wolff' 2010])

# Worm-like algorithms from Schwinger-Dyson equations

## Basic idea:

- **Schwinger-Dyson (SD) equations:** infinite hierarchy of linear equations for field correlators  $G(x_1, \dots, x_n)$

$$\int \mathcal{D}\phi \frac{\delta}{\delta\phi(x)} (\phi(x_1) \dots \phi(x_n) \exp(-S[\phi])) = 0$$

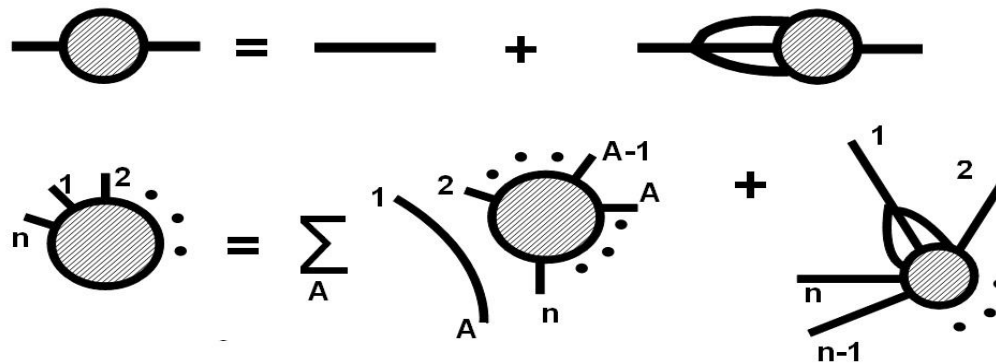
- **Solve SD equations:** interpret them as **steady-state equations** for some random process

$$w(A) = \sum_B P(B \rightarrow A) w(B)$$

- $G(x_1, \dots, x_n)$ :  $\sim$  probability to obtain  $\{x_1, \dots, x_n\}$   
(Like in Worm algorithm, but for all correlators)

# Example: Schwinger-Dyson equations in $\phi^4$ theory

$$S[\phi(x)] = \int d^D x \left( \frac{1}{2} \phi(x) (m^2 - \Delta) \phi(x) + \frac{\lambda}{4} \phi^4(x) \right)$$



$$G(x_1, x_2) = \delta(x_1, x_2) + \sum_{\pm\mu} \kappa G(x_1 \pm \hat{\mu}, x_2) - \lambda G(x_1, x_1, x_1, x_2)$$

$$G(x_1, x_2, \dots, x_n) = \sum_{A=2}^n \delta(x_1, x_A) G(x_1, \dots, x_{A-1}, x_{A+1}, \dots, x_n) + \sum_{\pm\mu} \kappa G(x_1 \pm \hat{\mu}, \dots, x_n) - \lambda G(x_1, x_1, x_1, x_2, \dots, x_n)$$

# Schwinger-Dyson equations for $\phi^4$ theory: stochastic interpretation

- Steady-state equations for Markov processes:

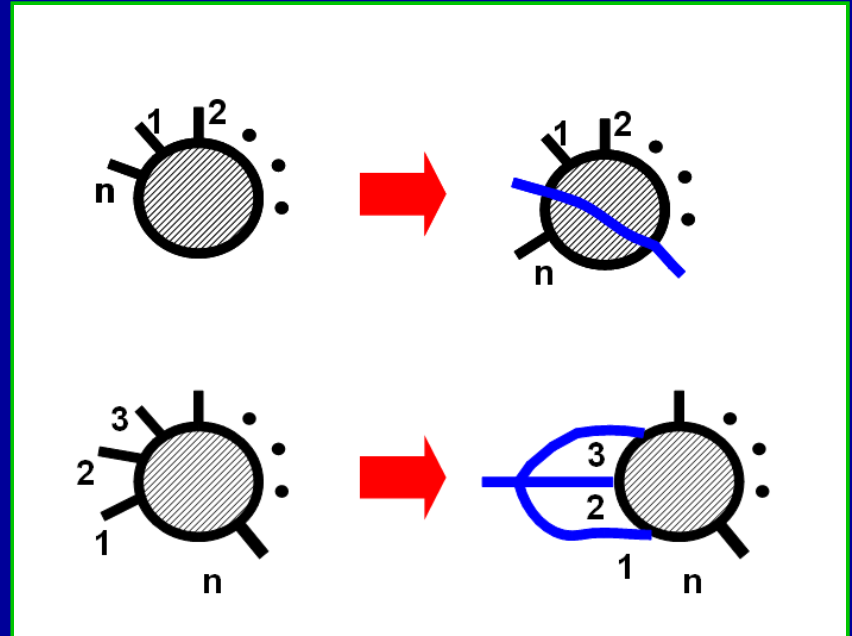
$$w(A) = \sum_B P(B \rightarrow A) w(B)$$

- Space of states:

sequences of coordinates  $\{x_1, \dots, x_n\}$

- Possible transitions:

- Add pair of points  $\{x, x\}$  at random position  
1 ... n + 1
- Random walk for topmost coordinate
- If three points meet – merge
- Restart with two points  $\{x, x\}$



- No truncation of SD equations
- No explicit form of perturbative series

# Stochastic interpretation in momentum space

- Steady-state equations for Markov processes:

$$w(A) = \sum_B P(B \rightarrow A) w(B)$$

- Space of states:

sequences of momenta  $\{p_1, \dots, p_n\}$

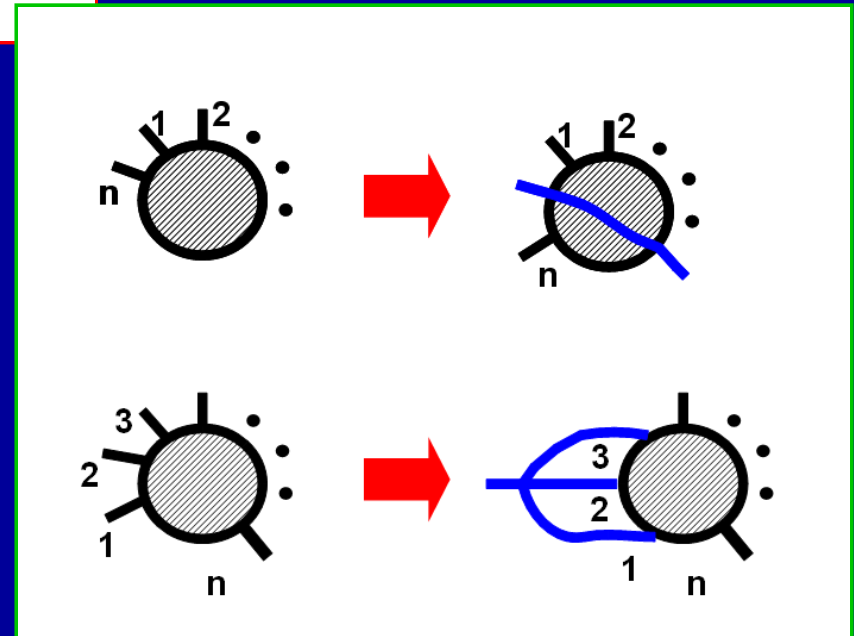
- Possible transitions:

- Add pair of momenta  $\{p, -p\}$  at positions 1,  $A = 2 \dots n + 1$
- Add up three first momenta (merge)

- Restart with  $\{p, -p\}$

- Probability for new momenta:

$$\sim \frac{1}{p^2 + m_0^2}$$



# Diagrammatic interpretation

History of such a random process: unique Feynman diagram  
**BUT:** no need to remember intermediate states

Measurements of connected, 1PI, 2PI correlators are possible!!! In practice: **label connected legs**

**Kinematical factor** for each diagram:

$$\int d^D q_1 \dots d^D q_{M_I} \prod_{i=1}^{M_I} \frac{1}{q_i^2 + m_0^2} \prod_{j=1}^{M_D} \frac{1}{Q_j^2 + m_0^2}$$

$q_i$  are **independent momenta**,  $Q_j$  – depend on  $q_i$



Monte-Carlo integration over independent momenta

# Normalizing the transition probabilities

- Problem: probability of “Add momenta” grows as  $(n+1)$ , rescaling  $G(p_1, \dots, p_n)$  – does not help.
- Manifestation of series divergence!!!
- Solution: explicitly count diagram order  $m$ . Transition probabilities depend on  $m$
- Extended state space:  $\{p_1, \dots, p_n\}$  and  $m$  – diagram order
- Field correlators:

$$G(p_1, \dots, p_n) = \sum_{m=0}^{+\infty} c_{n,m} (-\lambda)^m w_m(p_1, \dots, p_n)$$

- $w_m(p_1, \dots, p_n)$  – probability to encounter  $m$ -th order diagram with momenta  $\{p_1, \dots, p_n\}$  on external legs

# Normalizing the transition probabilities

- Finite transition probabilities:

$$C_{n,m} = \Gamma(n/2 + m + 1/2) x^{-(n-2)} y^{-m}$$

- **Factorial divergence** of series is absorbed into the growth of  $C_{n,m}$  !!!

- Probabilities (for optimal  $x, y$ ):

- Add momenta:

- Sum up momenta + increase the order:

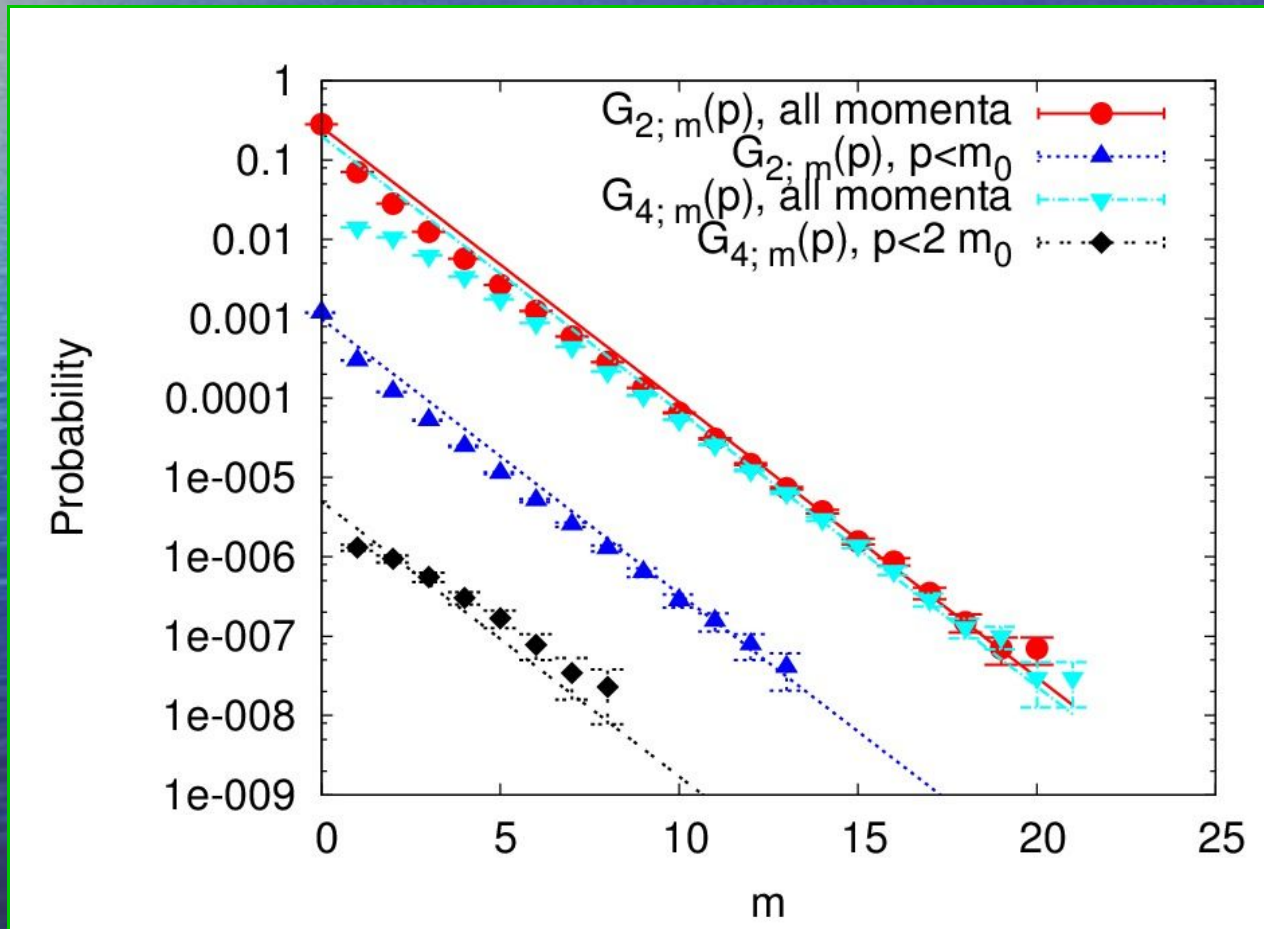
- Otherwise **restart**

$$p_A = \frac{1}{2} \frac{n+1}{n+m+1}$$
$$p_V = \frac{1}{2}$$

# Critical slowing down?

Transition probabilities do not depend on bare mass or coupling!!! (Unlike in the standard MC)

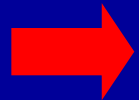
No free lunch: kinematical suppression of small-p region ( $\sim \Lambda_{IR}^D$ )



# Resummation

- Integral representation of  $C_{n,m} = \Gamma(n/2 + m + 1/2) x^{(n-2)} y^m$ :

$$G_n = x^{-n+2} \left( \frac{y}{\lambda_0} \right)^{\frac{n+1}{2}} \int_0^{+\infty} dz \exp\left(-\frac{yz}{\lambda_0}\right) z^{\frac{n-1}{2}} \left( \sum_{m=0}^{+\infty} (-z)^m w_{n,m} \right)$$



Pade-Borel resummation. Borel image of correlators!!!

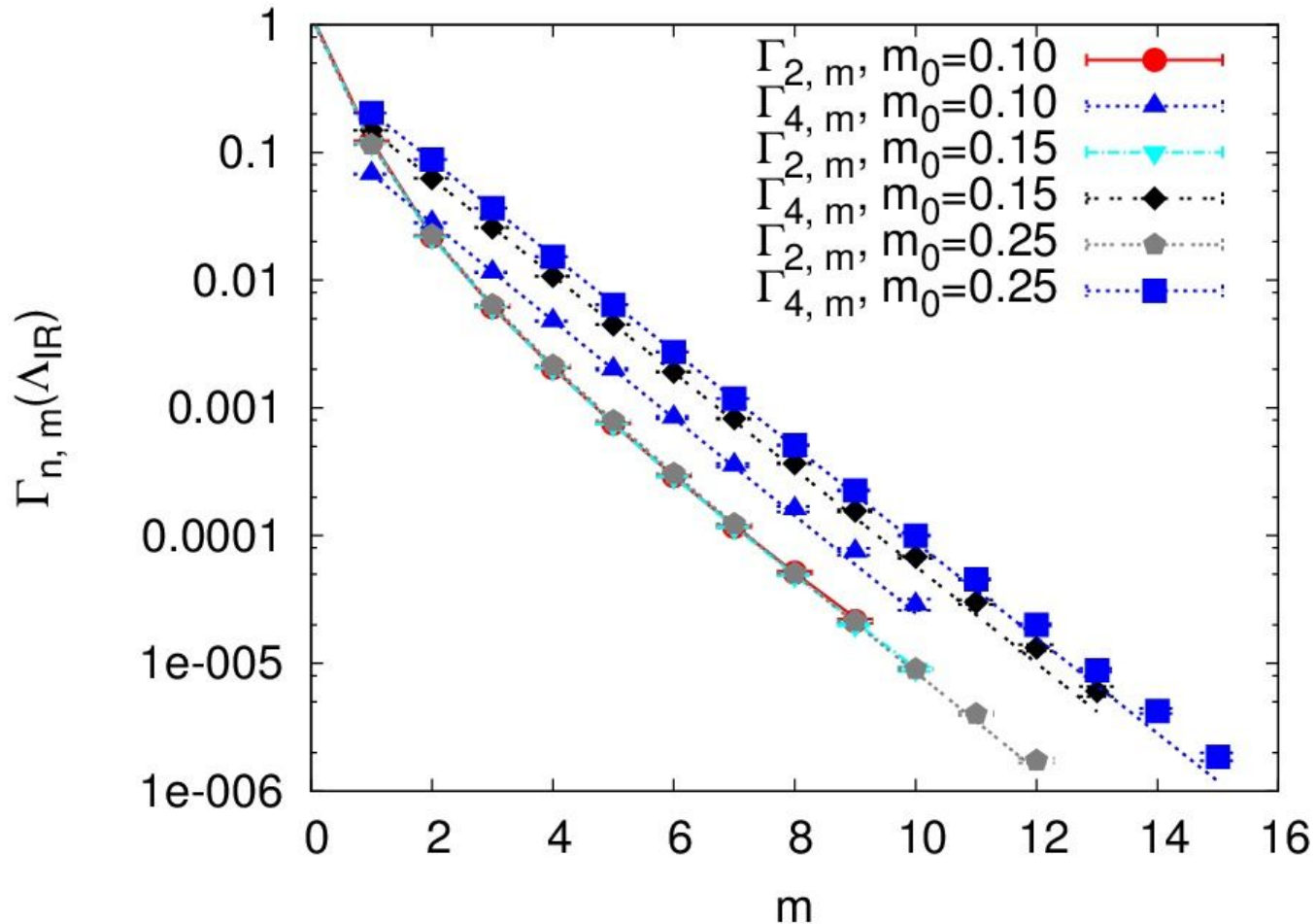
- Poles of Borel image: exponentials in  $w_{n,m}$

$$w_{n,m} = \sum_k a_k b_k^m$$

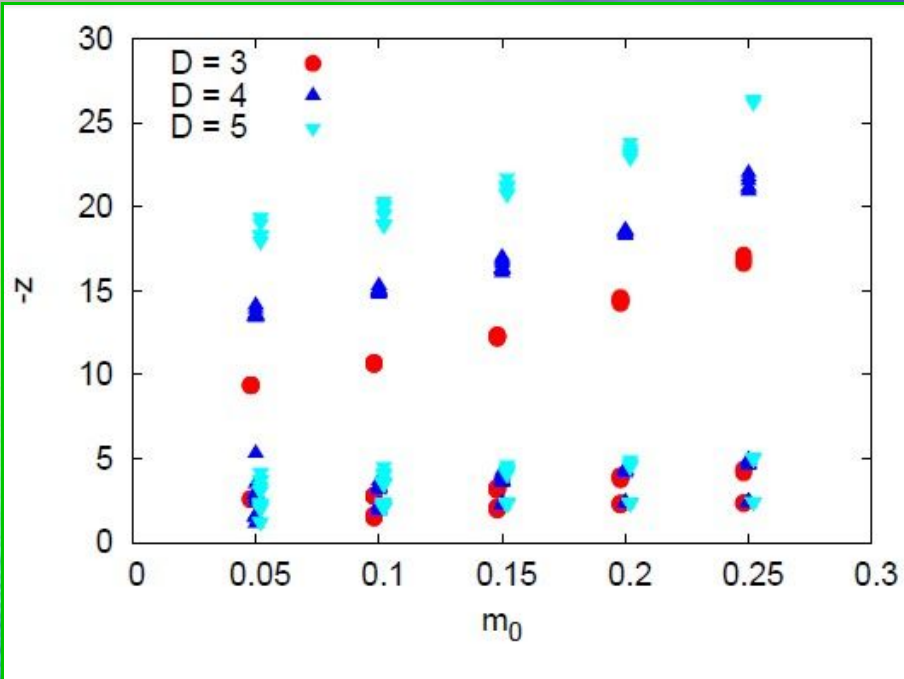
- Pade approximants are unstable
- Poles can be found by fitting
- Special fitting procedure using SVD of Hankel matrices

No need for resummation at large N!!!

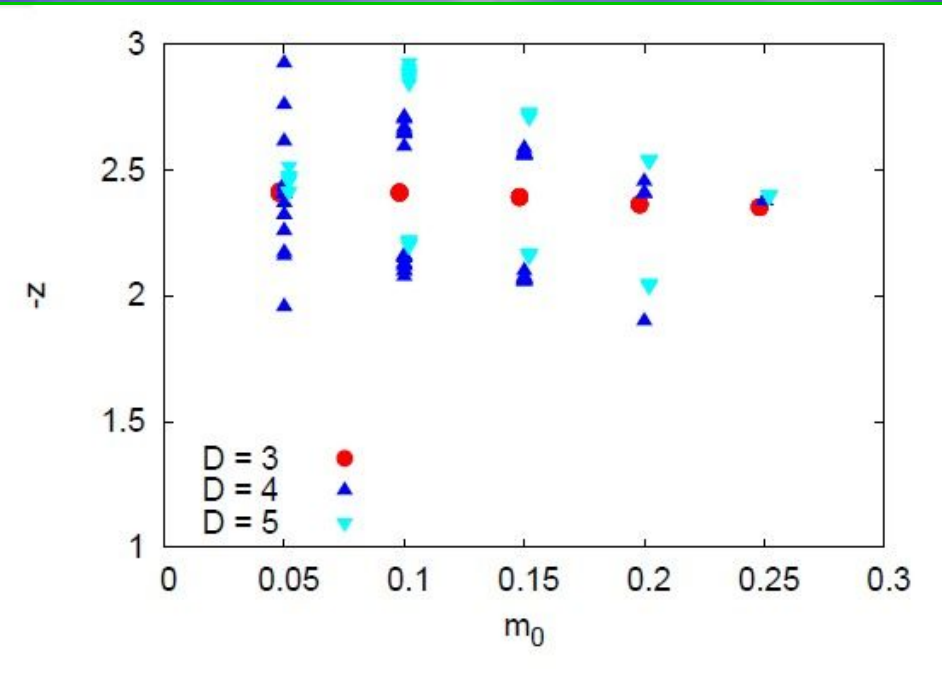
# Resummation: fits by multiple exponents



# Resummation: positions of poles



Two-point function



Connected truncated four-point function

2-3 poles can be extracted with reasonable accuracy

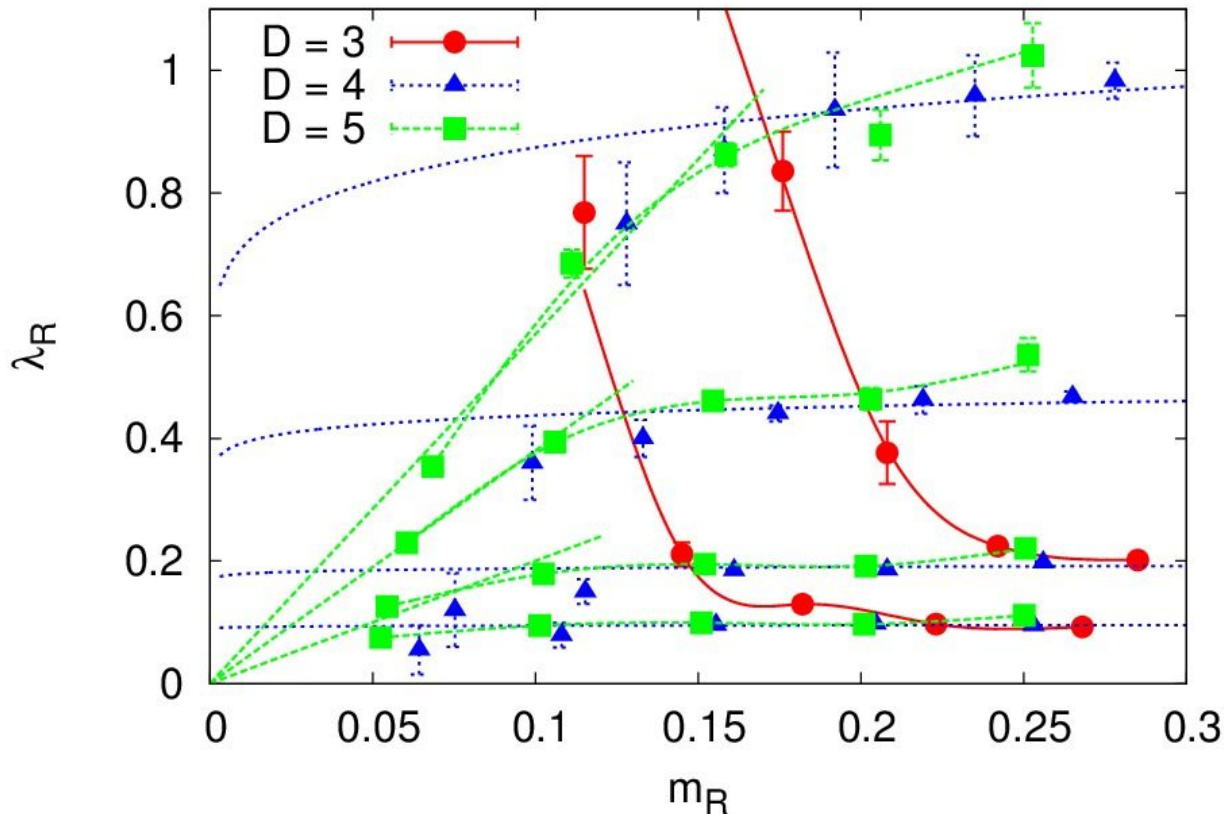
# Test: triviality of $\phi^4$ theory in $D \geq 4$

Renormalized mass:

$$G(p) = \frac{Z_R}{m_R^2 + p^2 + O(p^4)}$$

Renormalized coupling:

$$\lambda_R = -1/6 Z_R^2 \Gamma(0, 0, 0, 0)$$



CPU time:

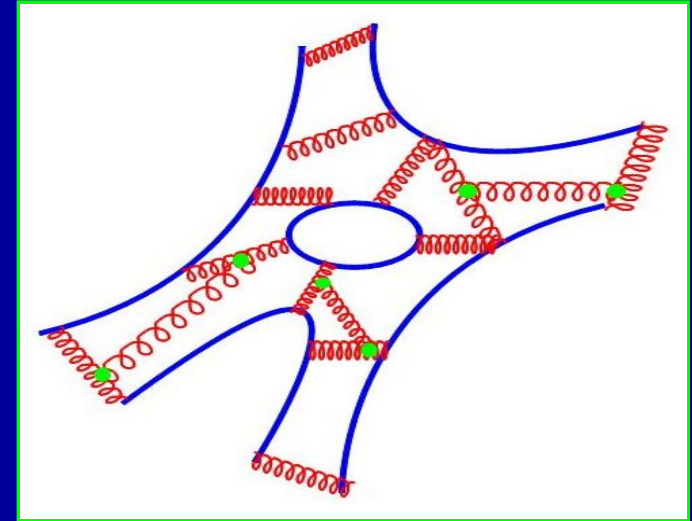
several hrs/point  
(2GHz core)

[Buividovich,  
ArXiv:1104.3459]

# Large-N gauge theory in the Veneziano limit

- Gauge theory with the action

$$L = -\frac{N}{\lambda} \text{Tr} F_{\mu\nu}^2 + \sum_{f=1}^{N_f} \bar{\psi}_f (D + m) \psi_f$$



- t-Hooft-Veneziano limit:

$$N \rightarrow \infty, \quad N_f \rightarrow \infty, \quad \lambda \text{ fixed}, \quad N_f/N \text{ fixed}$$

- Only **planar diagrams** contribute!  $\rightarrow$  connection with strings
- Factorization of Wilson loops  $W(C) = 1/N \text{tr} P \exp(i \int dx^\mu A_\mu)$ :

$$\langle W[C_1] W[C_2] \rangle = \langle W[C_1] \rangle \langle W[C_2] \rangle + O(1/N)$$

- Better approximation for real QCD than pure large-N gauge theory: meson decays, deconfinement phase etc.

# Large-N gauge theory in the Veneziano limit

- **Lattice action:**

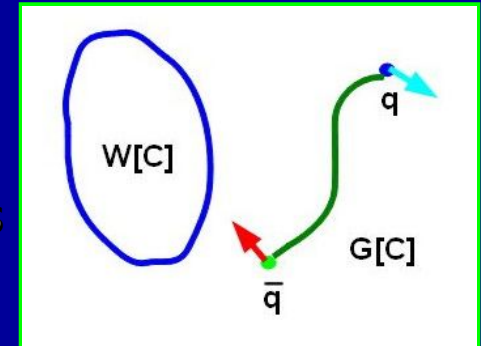
$$S = -N\beta \sum_p \text{Tr } g_p + \sum_x \bar{\psi}^f \psi^f - \sum_x \sum_\mu (\kappa_\mu^{(+)} \bar{\psi}^f(x - \hat{\mu}) (\gamma_{+\mu}) g_{x-\hat{\mu},\mu} \psi^f(x) - \kappa_\mu^{(-)} \bar{\psi}^f(x + \hat{\mu}) (\gamma_{-\mu}) g_{x,\mu}^\dagger \psi^f(x))$$

No EK reduction in the large-N limit! **Center symmetry broken by fermions.**

**Naive Dirac fermions:**  $N_f$  is infinite, no need to care about doublers!!!

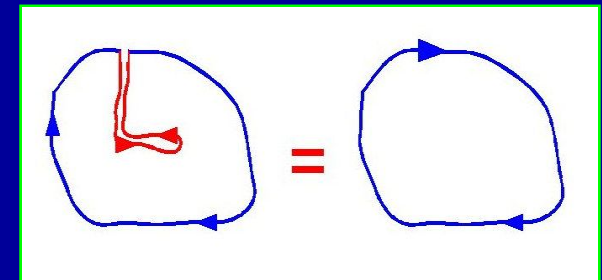
- **Basic observables:**

- Wilson loops = **closed string** amplitudes
- Wilson lines with quarks at the ends = **open string** amplitudes



$$W[l_1 \dots l_n] = \left\langle \frac{1}{N} \text{Tr} (g_{l_1} \dots g_{l_n}) \right\rangle$$

$$G_{\alpha\beta}[l_1 \dots l_n] = \left\langle \frac{1}{NN_f} \bar{\psi}_\beta^f(s_1) g_{l_1} \dots g_{l_n} \psi_\alpha^f(s_n) \right\rangle$$



- **Zigzag symmetry for QCD strings!!!** →

# Migdal-Makeenko loop equations

Loop equations in the **closed string** sector:

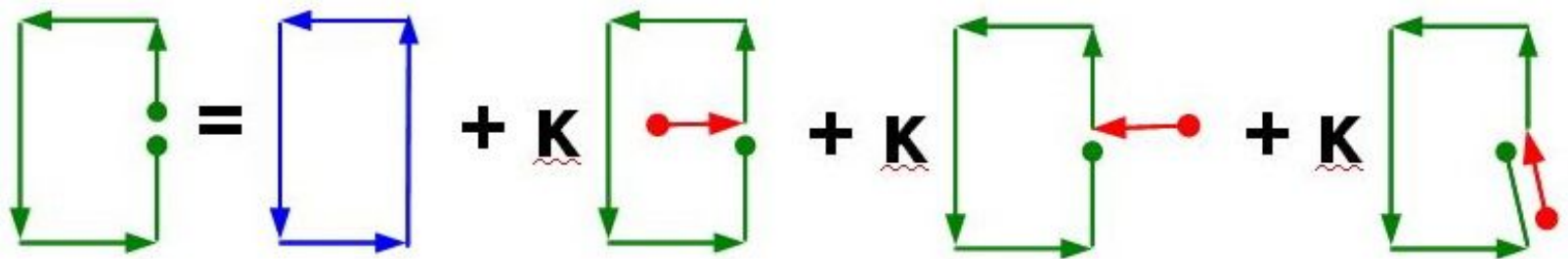
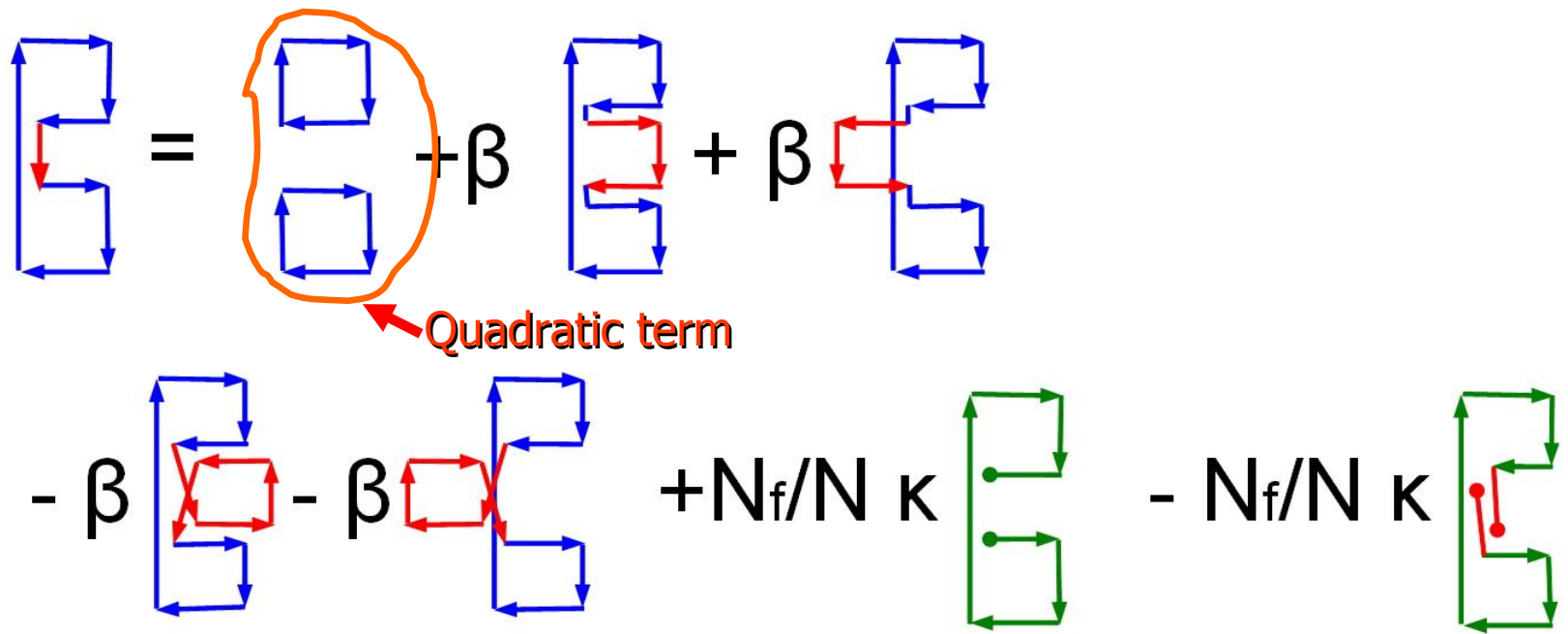
$$\begin{aligned}
 W[l_1 \dots l_n] = & \delta(l_1, -l_2) W[l_3 \dots l_n] + \delta(l_1, -l_n) W[l_2 \dots l_{n-1}] + \\
 & + \sum_{A=3}^{n-1} \delta(l_1, -l_A) W[l_2 \dots l_{A-1}] W[l_{A+1} \dots l_n] - \\
 & - \sum_{A=2}^n \delta(l_1, l_A) W[l_1 \dots l_{A-1}] W[l_A \dots l_n] + \\
 & + \beta \sum_{\text{staple}(l_1)} W[st\ l_2 \dots l_n] - \beta \sum_{\text{staple}(l_1)} W[l_1 (-st)\ l_1\ l_2 \dots l_n] + \\
 & + \frac{N_f}{N} \kappa_{\mu(l_1)}^{(-)} \left( \gamma_{-\mu(l_1)}^{\beta\alpha} \right) G_{\alpha\beta}(l_2 \dots l_n) - \frac{N_f}{N} \kappa_{\mu(l_1)}^{(+)} \left( \gamma_{+\mu(l_1)}^{\beta\alpha} \right) G_{\alpha\beta}(l_1\ l_2 \dots l_n\ l_1)
 \end{aligned}$$

Loop equations in the **open string** sector:

$$\begin{aligned}
 G_{\alpha\beta}[l_1 \dots l_n] = & -\delta_{\alpha\beta} \delta(s_1, s_n) W[l_1 \dots l_n] + \\
 & + \sum_{\mu} \kappa_{\mu}^{(+)} \left( \gamma_{+\mu}^{\alpha\delta} \right) G_{\delta\beta}(\mu l_1 \dots l_n) + \sum_{\mu} \kappa_{\mu}^{(-)} \left( \gamma_{-\mu}^{\alpha\delta} \right) G_{\delta\beta}((- \mu) l_1 \dots l_n)
 \end{aligned}$$

Infinite hierarchy of **quadratic equations!**  
 Markov-chain interpretation?

# Loop equations illustrated



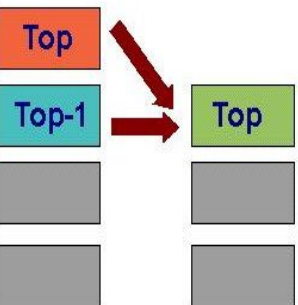
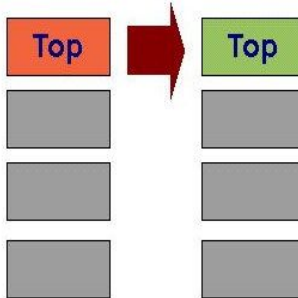
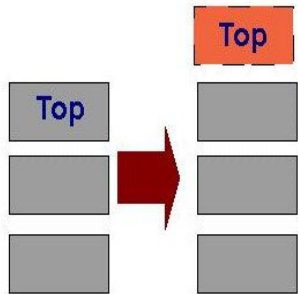
# Nonlinear Random Processes

[Buividovich, ArXiv:1009.4033]

Also: Recursive Markov Chain

[Etesami, Yannakakis, 2005]

- Let  $X$  be some discrete set
- Consider stack of the elements of  $X$
- At each process step:
  - **Create:** with probability  $P_c(x)$  create new  $x$  and push it to stack
  - **Evolve:** with probability  $P_e(x|y)$  replace  $y$  on the top of the stack with  $x$
  - **Merge:** with probability  $P_m(x|y_1, y_2)$  pop two elements  $y_1, y_2$  from the stack and push  $x$  into the stack
  - **Otherwise restart**



# Nonlinear Random Processes: Steady State and Propagation of Chaos

- Probability to find  $n$  elements  $x_1 \dots x_n$  in the stack:

$$W(x_1, \dots, x_n)$$

- Propagation of chaos [McKean, 1966]  
( = factorization at large- $N$  [tHooft, Witten, 197x]):

$$W(x_1, \dots, x_n) = w_0(x_1) w(x_2) \dots w(x_n)$$

- Steady-state equation (sum over  $y, z$ ):

$$w(x) = P_c(x) + P_e(x|y) w(y) + P_m(x|y,z) w(y) w(z)$$

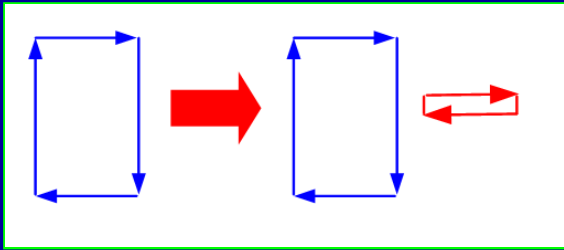
# Loop equations: stochastic interpretation

Stack of strings (= open or closed loops)!

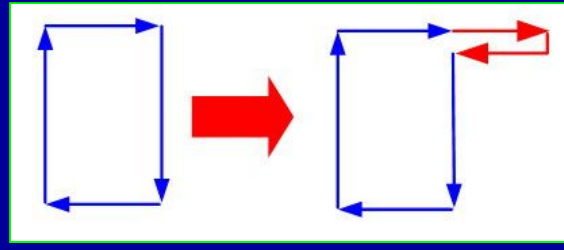
Wilson loop  $W[C] \sim$  Probability of generating loop  $C$

Possible transitions (closed string sector):

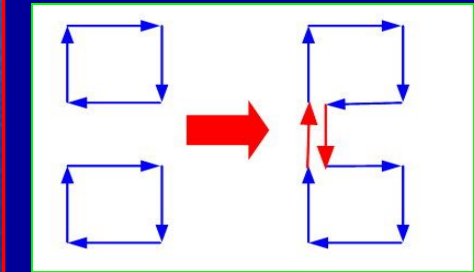
Create new string



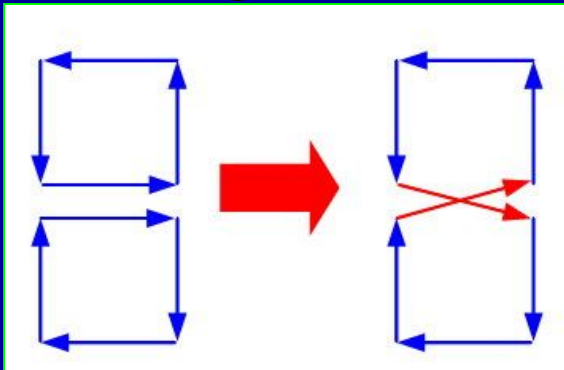
Append links to string



Join strings with links

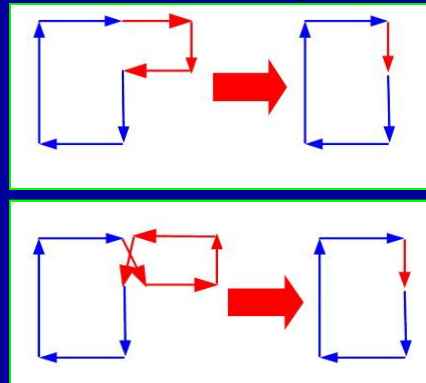


Join strings



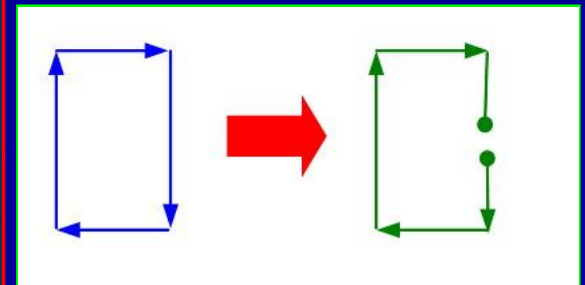
...if have collinear links

Remove staples



Probability  $\sim \beta$

Create open string



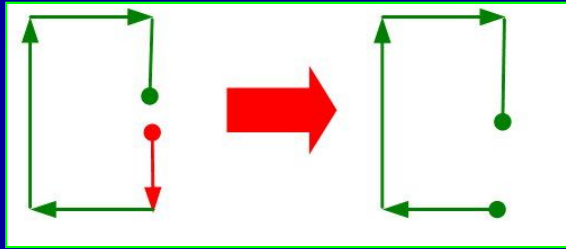
Identical spin states

# Loop equations: stochastic interpretation

Stack of strings (= open or closed loops)!

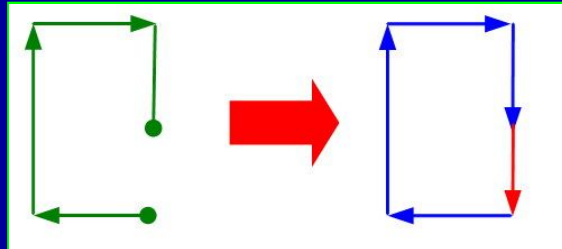
Possible transitions (open string sector):

Truncate open string



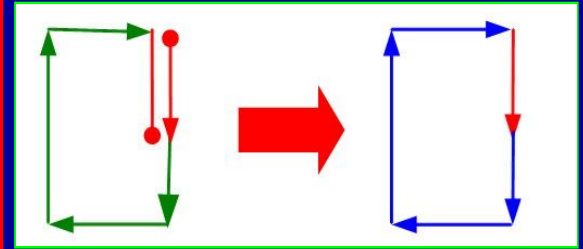
Probability  $\sim \kappa$

Close by adding link



Probability  $\sim N_f / N \kappa$

Close by removing link

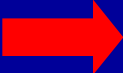


Probability  $\sim N_f / N \kappa$

- Hopping expansion for fermions ( $\sim 20$  ord.)
- Strong-coupling expansion (series in  $\beta$ ) for gauge fields ( $\sim 5$  orders)

**Disclaimer:** this work is in progress, so the algorithm is far from optimal...

# Sign problem revisited

- Different terms in loop equations have different **signs**
-  Configurations should be additionally **reweighted**
- Each loop comes with a **complex-valued phase**  
( $+/-1$  in **pure gauge**,  $\exp(i \pi k/4)$  with **Dirac fermions** )
- **Sign problem is very mild** (strong-coupling only)?

$$\frac{P_+ - P_-}{P_+ + P_-} \sim 0.7 \quad \text{for } 1 \times 1 \text{ Wilson loops}$$

- For large  $\beta$  (**close to the continuum**):  
**sign problem** should be important
- Large terms  $\sim \beta$  **sum up to  $\sim 1$**

# Temperature and chemical potential

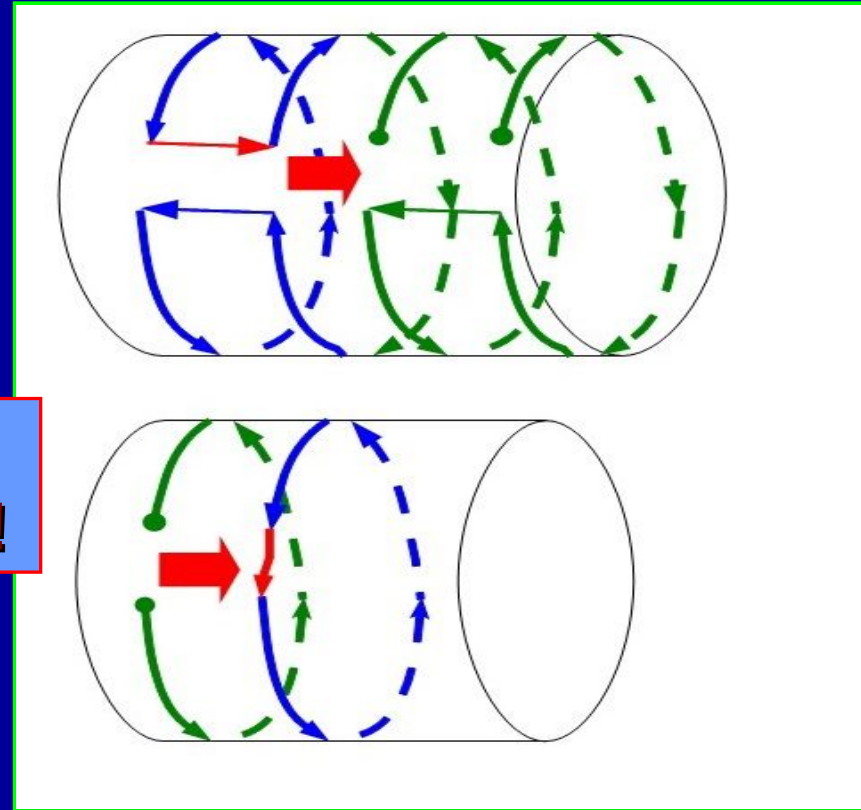
- Finite temperature: strings on cylinder  $R \sim 1/T$
- Winding strings = Polyakov loops  $\sim$  quark free energy
- No way to create winding string in pure gauge theory at large- $N$   $\longrightarrow$  EK reduction

- Veneziano limit:  
open strings wrap and close
- Chemical potential:

$$\kappa \rightarrow \kappa \exp(+/- \mu)$$

**No signs  
or phases!**

- Strings oriented in the time direction are favoured

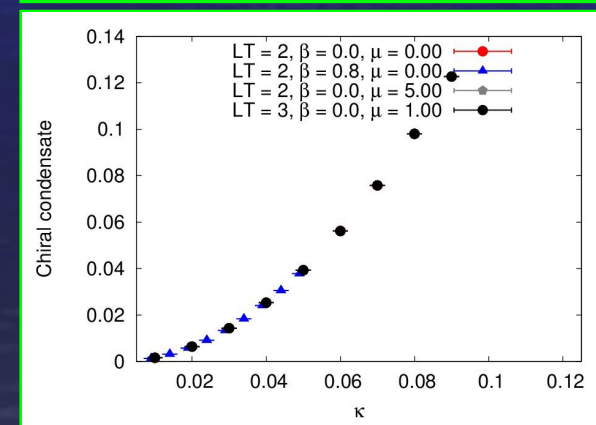
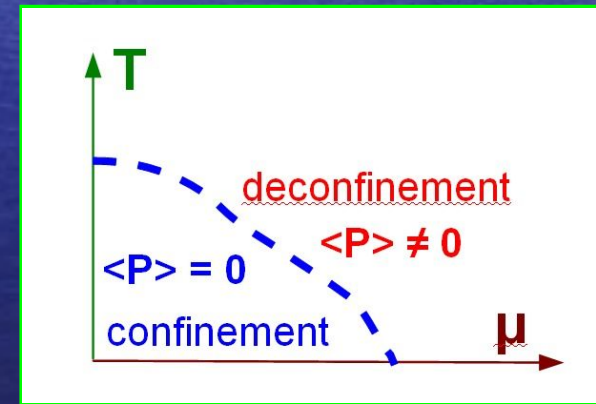
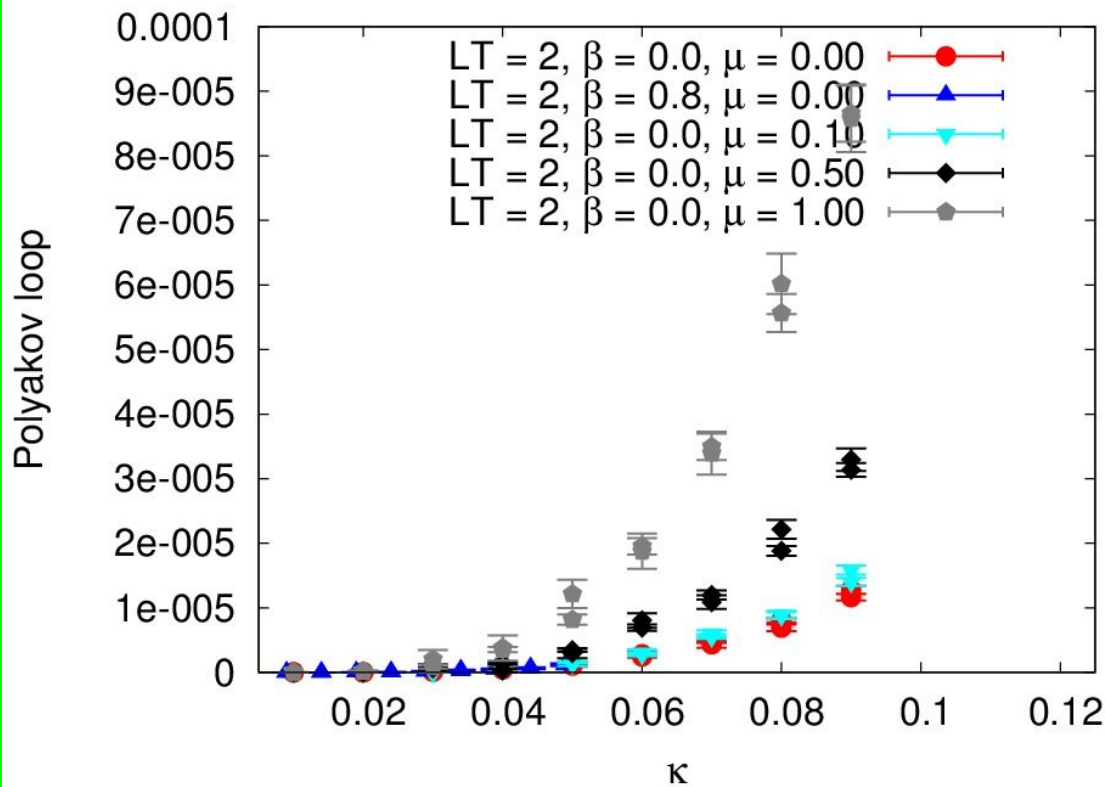


# Phase diagram of the theory: a sketch

High temperature  
(small cylinder radius)  
OR  
Large chemical potential



Numerous winding strings  
↓  
Nonzero Polyakov loop  
↓  
Deconfinement phase



# Summary and outlook

- **Diagrammatic Monte-Carlo** and **Worm algorithm**: useful strategies complimentary to standard Monte-Carlo
- **Stochastic interpretation of Schwinger-Dyson equations**: a novel way to stochastically sum up perturbative series

## Advantages:

- Implicit construction of perturbation theory
- No truncation of SD eq-s
- Large-N limit is very easy
- Naturally treats divergent series
- No sign problem at  $\mu \neq 0$

## Disadvantages:

- Limited to the “very strong-coupling” expansion (so far?)
- Requires large statistics in IR region

**QCD** in terms of strings without explicit “stringy” action!!!

# Summary and outlook

Possible extensions:

- Weak-coupling theory: Wilson loops in **momentum space?**
- Combination with **Renormalization-Group** techniques?
- A study of large- $N$  models of **quantum gravity** is feasible (**IKKT model** etc.)
- Extension to  **$SU(3)$** :  $1/N$  expansion? **Explicit resummation?**

# Thank you for your attention!!!

## References:

- ArXiv:1104.3459 ( $\phi^4$  theory)
- ArXiv:1009.4033, 1011.2664 (large-N theories)
- Some **sample codes** are available at:

<http://www.lattice.itep.ru/~pbaivid/codes.html>



**Back-up slides**

# Some historical remarks

“Genetic” algorithm vs. branching random process

Probability to find some configuration of branches obeys nonlinear equation

Steady state due to creation and merging

Recursive Markov Chains  
[Etesami, Yannakakis, 2005]

Also some modification of McKean-Vlasov-Kac models  
[McKean, Vlasov, Kac, 196x]

“Extinction probability” obeys nonlinear equation  
[Galton, Watson, 1974]

“Extinction of peerage”

Attempts to solve QCD loop equations  
[Migdal, Marchesini, 1981]

“Loop extinction”:  
No importance sampling

