# QCD at nonzero chemical potential and the sign problem

INT lectures 2012

#### V: complex Langevin dynamics

Gert Aarts



### Where are we?

complex weight:

- straightforward importance sampling not possible
- overlap problem

various possibilities:

- preserve overlap as best as possible
- use approximate methods at small  $\mu$
- do something radical:
  - rewrite partition function in other dof
  - explore field space in a different way

**.**..

# Overlap problem

- configurations differ in an essential way from those obtained at  $\mu = 0$  or with  $|\det M|$
- cancelation between configurations with 'positive' and 'negative' weight

dominant configurations in the path integral?



# Complex integrals

#### consider simple integral

$$Z(a,b) = \int_{-\infty}^{\infty} dx \, e^{-S(x)} \qquad S(x) = ax^2 + ibx$$

- complete the square/saddle point approximation: into complex plane
- Iesson: don't be real(istic), be more imaginative

radically different approach:

- complexify all degrees of freedom  $x \to z = x + iy$
- enlarged complexified space
- new directions to explore

# Complexified field space

#### dominant configurations in the path integral?



real and positive distribution P(x, y): how to obtain it?

 $\Rightarrow$  solution of stochastic process

complex Langevin dynamics

Parisi 83, Klauder 83

consider complex Gaussian integral

$$Z(a,b) = \int_{-\infty}^{\infty} dx \, e^{-\frac{1}{2}ax^2 - ibx} \qquad \left($$

$$\left(=\sqrt{\frac{2\pi}{a}}e^{-\frac{1}{2}b^2/a}\right)$$

complex action  $S^*(b) = S(-b^*)$  [assume a > 0 and real]

phase quenched theory

$$Z_{\rm pq} = \int_{-\infty}^{\infty} dx \, e^{-\frac{1}{2}ax^2} = Z(a,0) = \sqrt{\frac{2\pi}{a}}$$

sign problem: average phase factor

$$\langle e^{-ibx} \rangle_{pq} = \frac{Z(a,b)}{Z(a,0)} = e^{-\frac{1}{2}b^2/a}$$

average phase factor: one degree of freedom only

$$\langle e^{-ibx} \rangle_{pq} = \frac{Z(a,b)}{Z(a,0)} = e^{-\frac{1}{2}b^2/a}$$

sign problem only bad when b gets large

• for N degrees of freedom  $x_j$ ,  $j = 1, \ldots, N$ 

$$\langle e^{-ib\sum_j x_j} \rangle_{\mathrm{pq}} = e^{-\frac{1}{2}Nb^2/a}$$

limits  $b \to 0$ ,  $N \to \infty$  do not commute

severe sign problem for all  $b \neq 0$  in  $N \rightarrow \infty$  limit mimicks nonzero  $\mu$  problem

$$Z(a,b) = \int dx \, e^{-\frac{1}{2}ax^2 - ibx} \qquad \langle x^2 \rangle = -2\frac{\partial \ln Z}{\partial a} = \frac{a - b^2}{a^2}$$

goal: compute numerically without importance sampling

first take b = 0:

use analogy with Brownian motion

Parisi & Wu 81

particle in a fluid: friction (a) and kicks ( $\eta$ )

Langevin equation

$$\frac{d}{dt}x(t) = -ax(t) + \eta(t) \qquad \langle \eta(t)\eta(t') \rangle = 2\delta(t - t')$$

- **Solution** Langevin equation  $\dot{x}(t) = -ax(t) + \eta(t)$
- analytical solution

$$x(t) = e^{-at}x(0) + \int_0^t ds \,\eta(s)e^{-a(t-s)}$$

**•** correlator [take x(0) = 0, no i.c. dependence]

$$\langle x^2(t)\rangle = \int_0^t ds \int_0^t ds' \langle \eta(s)\eta(s')\rangle e^{-a(2t-s-s')}$$

• noise averaged correlator, use  $\langle \eta(s)\eta(s')\rangle = 2\delta(s-s')$ 

$$\lim_{t \to \infty} \langle x^2(t) \rangle = \frac{1}{a}$$

no importance sampling, solution of stochastic process

# Fokker-Planck equation

associated distribution  $\rho(x,t)$ 

$$\langle O(x(t)) \rangle_{\eta} = \int dx \, \rho(x,t) O(x)$$

noise average

distribution average

• Langevin eq for  $x(t) \Leftrightarrow$  Fokker-Planck eq for  $\rho(x, t)$  $\dot{\rho}(x, t) = \partial_x \left(\partial_x + S'(x)\right) \rho(x, t)$ 

**stationary solution:**  $\rho(x) \sim e^{-S(x)}$ 

review: Damgaard & Hüffel 87

### Fokker-Planck equation

stationary solution typically reached exponentially fast

$$\dot{\rho}(x,t) = \partial_x \left( \partial_x + S'(x) \right) \rho(x,t)$$

• write  $\rho(x,t) = \psi(x,t)e^{-\frac{1}{2}S(x)}$ 

$$\dot{\psi}(x,t) = -H_{\rm FP}\psi(x,t)$$

Fokker-Planck hamiltonian:

$$H_{\rm FP} = Q^{\dagger}Q = \left[-\partial_x + \frac{1}{2}S'(x)\right] \left[\partial_x + \frac{1}{2}S'(x)\right] \ge 0$$
$$Q\psi(x) = 0 \qquad \Leftrightarrow \qquad \psi(x) \sim e^{-\frac{1}{2}S(x)}$$
$$\psi(x,t) = c_0 e^{-\frac{1}{2}S(x)} + \sum_{\lambda>0} c_\lambda e^{-\lambda t} \to c_0 e^{-\frac{1}{2}S(x)}$$

INT, August 2012 - p. 8

# **Complex Gaussian integral**

$$Z(a,b) = \int dx \, e^{-S(x)}$$
  $S(x) = \frac{1}{2}ax^2 + ibx$ 

- $b \neq 0$ :
  - analytically: complete the square shift in the complex plane  $x \to x + i \frac{b}{a}$
  - achieve the same with Langevin equation
    "complexify"  $x \to z = x + iy$

$$\dot{x} = -\operatorname{Re} \partial_z S(z) + \eta = -ax + \eta$$
$$\dot{y} = -\operatorname{Im} \partial_z S(z) = -ay - b$$

with S(z) = S(x + iy)

# Complex Gaussian integral

• solution: 
$$x(t) = x(0)e^{-at} + \int_0^t ds \, e^{-a(t-s)}\eta(s)$$
  
 $y(t) = [y(0) + b/a]e^{-at} - b/a$ 

#### *correlators*:

$$\langle x^{2}(t) \rangle = x^{2}(0)e^{-2at} + (1 - e^{-2at})/a \to 1/a \langle x(t)y(t) \rangle = x(0)e^{-at} ([y(0) + b/a]e^{-at} - b/a) \to 0 \langle y^{2}(t) \rangle = ([y(0) + b/a]e^{-at} - b/a)^{2} \to b^{2}/a^{2}$$

**s** combination  $x \to x + iy$ :

$$\lim_{t \to \infty} \langle [x(t) + iy(t)]^2 \rangle = \langle x^2 - y^2 + 2ixy \rangle = \frac{1}{a} - \frac{b^2}{a^2} = \frac{a - b^2}{a^2}$$

correct!

# Distribution

associated distribution P(x, y; t) in complex plane

real and positive distribution (if it exists)

$$\langle O(x+iy)(t)\rangle = \int dxdy P(x,y;t)O(x+iy)$$

Langevin eq for x(t) and y(t) Fokker-Planck eq for P(x, y; t)

Fokker-Planck equation:

 $\dot{P}(x,y;t) = \left[\partial_x \left(\partial_x + \operatorname{Re} \partial_z S\right) + \partial_y \operatorname{Im} \partial_z S\right] P(x,y;t)$ 

- solvable in Gaussian models (like here)
- no generic solutions known no semi-positive Fokker-Planck hamiltonian (in contrast to real Langevin/action)

## Distribution

#### distribution P(x, y) in the complex plane



shift in the complex plane:  $y \rightarrow -b/a$ 

Langevin process "finds" distribution:

$$P(x,y) \sim e^{-ax^2/2}\delta(y+b/a)$$

## More interesting Gaussian integral

final Gaussian example:

$$S = \frac{1}{2}(a+ib)x^2 \qquad \langle x^2 \rangle = \frac{1}{a+ib}$$

coupled Langevin equations

$$\dot{x} = -ax + by + \eta \qquad \qquad \dot{y} = -ay - bx$$

 $\checkmark$  solve and find correlators when  $t \to \infty$ 

$$\langle x^{2} \rangle = \frac{1}{2a} \frac{2a^{2} + b^{2}}{a^{2} + b^{2}} \qquad \langle y^{2} \rangle = \frac{1}{2a} \frac{b^{2}}{a^{2} + b^{2}} \qquad \langle xy \rangle = -\frac{1}{2} \frac{b}{a^{2} + b^{2}}$$
  
• correlator  $\langle z^{2} \rangle = \langle x^{2} - y^{2} + 2ixy \rangle = \frac{a - ib}{a^{2} + b^{2}} = \frac{1}{a + ib}$ 

correct!

# More interesting Gaussian integral

#### distribution P(x, y) in the complex plane



P(x, y)



Langevin process "finds" this distribution

original weight  $e^{-S}$  is complex

this distribution is real and positive

# Equilibrium distributions

complex weight  $\rho(x)$  real weight P(x,y)

main premise:

$$\int dx \,\rho(x)O(x) = \int dx dy \,P(x,y)O(x+iy)$$

• if equilibrium distribution P(x, y) is known analytically: shift variables

$$\int dxdy P(x,y)O(x+iy) = \int dx O(x) \int dy P(x-iy,y)$$

$$\Rightarrow \rho(x) = \int dy \, P(x - iy, y)$$

- correct in Gaussian examples
- hard to verify in numerical studies!

## Discretization

most cases not analytically solvable numerical solution of Langevin equation

discretize stochastic equation (Ito calculus)

$$x_{n+1} = x_n + \epsilon K_n^{\mathbf{R}} + \sqrt{\epsilon}\eta_n$$
$$y_{n+1} = y_n + \epsilon K_n^{\mathbf{I}}$$

drift terms

$$K_n^{\rm R} = -{\rm Re} \, \frac{\partial S}{\partial z} \qquad \qquad K_n^{\rm I} = -{\rm Im} \, \frac{\partial S}{\partial z}$$

$$\langle \eta_n \eta_{n'} \rangle = \delta_{nn'}$$

use adaptive stepsize if necessary

# Stochastic quantizaton

adapt to field theory

Parisi & Wu 81, Parisi, Klauder 83

- **•** path integral  $Z = \int D\phi e^{-S}$
- Langevin dynamics in "fifth" time direction

$$\frac{\partial \phi(x,t)}{\partial t} = -\frac{\delta S[\phi]}{\delta \phi(x,t)} + \eta(x,t)$$

Gaussian noise

$$\langle \eta(x,t) \rangle = 0$$
  $\langle \eta(x,t)\eta(x',t') \rangle = 2\delta(x-x')\delta(t-t')$ 

- compute expectation values  $\langle \phi(x,t)\phi(x',t) \rangle$ , etc
- $\checkmark$  study converge as  $t \to \infty$

### Phase transitions and the Silver Blaze

can complex Langevin dynamics handle:

- a severe sign problem?
- the thermodynamic limit?
- phase transitions?

. . .

the Silver Blaze problem?

Cohen 03

study in a model with a phase diagram with similar features as QCD at low temperature

 $\Rightarrow$  relativistic Bose gas at nonzero  $\mu$ 

GA 08-09

- scalar O(2) model with global symmetry
- continuum action

$$S = \int d^4x \left[ \left| \partial_{\nu} \phi \right|^2 + (m^2 - \mu^2) |\phi|^2 + \mu \left( \phi^* \partial_4 \phi - \partial_4 \phi^* \phi \right) + \lambda |\phi|^4 \right]$$

**s** complex scalar field, d = 4,  $m^2 > 0$ 

• 
$$S^*(\mu) = S(-\mu^*)$$
 as in QCD

scalar O(2) model with global symmetry

Iattice action

.

$$S = \sum_{x} \left[ \left( 2d + m^{2} \right) \phi_{x}^{*} \phi_{x} + \lambda \left( \phi_{x}^{*} \phi_{x} \right)^{2} - \sum_{\nu=1}^{4} \left( \phi_{x}^{*} e^{-\mu \delta_{\nu,4}} \phi_{x+\hat{\nu}} + \phi_{x+\hat{\nu}}^{*} e^{\mu \delta_{\nu,4}} \phi_{x} \right) \right]$$

• complex scalar field, d = 4,  $m^2 > 0$ 

• 
$$S^*(\mu) = S(-\mu^*)$$
 as in QCD

tree level potential in the continuum

$$V(\phi) = (m^{2} - \mu^{2})|\phi|^{2} + \lambda|\phi|^{4}$$

condensation when  $\mu^2 > m^2$ , SSB



• write 
$$\phi = (\phi_1 + i\phi_2)/\sqrt{2} \Rightarrow \phi_a \ (a = 1, 2)$$

- complexification  $\phi_a \rightarrow \phi_a^{\rm R} + i\phi_a^{\rm I}$
- complex Langevin equations

$$\frac{\partial \phi_a^{\mathrm{R}}}{\partial t} = -\mathrm{Re} \left. \frac{\delta S}{\delta \phi_a} \right|_{\phi_a \to \phi_a^{\mathrm{R}} + i\phi_a^{\mathrm{I}}} + \eta_a$$
$$\frac{\partial \phi_a^{\mathrm{I}}}{\partial t} = -\mathrm{Im} \left. \frac{\delta S}{\delta \phi_a} \right|_{\phi_a \to \phi_a^{\mathrm{R}} + i\phi^{\mathrm{I}}}$$

- straightforward to solve numerically,  $m = \lambda = 1$
- In lattices of size  $N^4$ , with N = 4, 6, 8, 10





field modulus squared 
$$|\phi|^2 \rightarrow \frac{1}{2} \left( \phi_a^{R^2} - \phi_a^{I^2} \right) + i \phi_a^R \phi_a^I$$



second order phase transition in thermodynamic limit





second order phase transition in thermodynamic limit

## Silver Blaze and the sign problem

Silver Blaze and sign problems are intimately related

 $\blacksquare$  phase quenched theory  $Z_{pq} = \int D\phi |e^{-S}|$ 

physics of phase quenched theory:

 chemical potential appears only in mass parameter (in continuum notation)

$$V = (m^{2} - \mu^{2})|\phi|^{2} + \lambda|\phi|^{4}$$

Just dynamics of symmetry breaking, no Silver Blaze

in QCD: phase quenched = finite isospin onset at  $\mu = m_{\pi}/2$  instead of  $m_B/3$ 

# Silver Blaze and the sign problem



phase  $e^{i\varphi} = e^{-S}/|e^{-S}|$  does precisely what is expected

### How severe is the sign problem?

- complex action  $e^{-S} = |e^{-S}|e^{i\varphi}$
- average phase factor in phase quenched theory



exponentially hard in thermodynamic limit

# Lattice gauge theory

#### partition function

$$Z = \int DU \, e^{-S_B} \, \det M$$

- M is the fermion matrix
- fermion determinant is complex

$$[\det M(\mu)]^* = \det M(-\mu^*)$$

# SU(3) lattice gauge theory

Langevin update for link variables  $U_{x\nu}$ :

 $U_{x\nu}(t+\epsilon) = R_{x\nu}(t) U_{x\nu}(t) \qquad R_{x\nu} = \exp\left[i\lambda_a\left(\epsilon K_{x\nu a} + \sqrt{\epsilon}\eta_{x\nu a}\right)\right]$ Gell-mann matrices  $\lambda_a$  ( $a = 1, \dots 8$ )  $K_{x\nu a} = -D_{x\nu a}S_{\text{eff}}[U] \qquad S_{\text{eff}} = S_B + S_F \qquad S_F = -\ln\det M$ onoise

 $\langle \eta_{x\nu a} \rangle = 0 \qquad \qquad \langle \eta_{x\nu a} \eta_{x'\nu' a} \rangle = 2\delta_{xx'} \delta_{\nu\nu'} \delta_{aa'}$ 

real action:  $\Rightarrow K^{\dagger} = K \Leftrightarrow R^{\dagger}R = 1 \Leftrightarrow U \in SU(3)$ 

complex action:  $\Rightarrow K^{\dagger} \neq K \Leftrightarrow R^{\dagger}R \neq 1 \Leftrightarrow U \in SL(3, \mathbb{C})$ 

## Heavy dense QCD

bosonic action: standard SU(3) Wilson action

$$S_B = -\beta \sum_P \left(\frac{1}{6} \left[ \text{Tr } U_P + \text{Tr } U_P^{-1} \right] - 1 \right)$$

determinant det M for Wilson fermions fermion matrix:

$$M = 1 - \kappa \sum_{i=1}^{3} \operatorname{space} - \kappa \left( e^{\mu} \Gamma_{+4} U_{x,4} T_{4} + e^{-\mu} \Gamma_{-4} U_{x,4}^{-1} T_{-4} \right)$$

# Heavy dense QCD

hopping expansion:

$$\det M \approx \det \left[ 1 - \kappa \left( e^{\mu} \Gamma_{+4} U_{x,4} T_4 + e^{-\mu} \Gamma_{-4} U_{x,4}^{-1} T_{-4} \right) \right]$$
$$= \prod_{\mathbf{x}} \det \left( 1 + h e^{\mu/T} \mathcal{P}_{\mathbf{x}} \right)^2 \det \left( 1 + h e^{-\mu/T} \mathcal{P}_{\mathbf{x}}^{-1} \right)^2$$

with  $h = (2\kappa)^{N_{\tau}}$  and (conjugate) Polyakov loops  $\mathcal{P}_{\mathbf{x}}^{(-1)}$ 

- static quarks propagate in temporal direction only: Polyakov loops
- full gauge dynamics included

GA & Stamatescu 08

## Density



first results on  $4^4$  lattice at  $\beta = 5.6$ ,  $\kappa = 0.12$ ,  $N_f = 3$ 

low-density phase  $\Rightarrow$  high-density phase

## (conjugate) Polyakov loops

results on  $4^4$  lattice at  $\beta = 5.6$ ,  $\kappa = 0.12$ ,  $N_f = 3$ 



low-density "confining" phase  $\Rightarrow$  high-density "deconfining" phase

# $SU(3) \rightarrow SL(3,\mathbb{C})$

- complex Langevin dynamics: no longer in SU(3)
- instead  $U \in SL(3, \mathbb{C})$
- in terms of gauge potentials  $U = e^{i\lambda_a A_a/2}$  $A_a$  is now complex
- how far from SU(3)?

#### consider

$$\frac{1}{N} \operatorname{Tr} U^{\dagger} U \begin{cases} = 1 & \text{if } U \in \mathsf{SU}(N) \\ \geq 1 & \text{if } U \in \mathsf{SL}(N,\mathbb{C}) \end{cases}$$



# One-dimensional QCD

Sexactly solvable
Gibbs 86, Bilic & Demeterfi 88

**•** phase quenched: transition at  $\mu = \mu_c$ , full: no transition

severe sign problem when  $|\mu| > |\mu_c|$ 

chiral condensate: write as integral over spectral density

$$\Sigma = \int d^2 z \, \frac{\rho(z;\mu)}{z+m} \qquad \qquad \mu_c = \operatorname{arcsinh} m$$

- $\ \ \, \ \, 
  ho(z;\mu) \ \, {\rm complex \ and \ \, oscillatory} \ \ \, {\rm _{Ravagli}} \ \, {\rm _{\& \ Verbaarschot}} \ \, {\rm _{07}} \ \,$
- **s** condensate independent of  $\mu$ : Silver Blaze
- solve with complex Langevin

GA & Splittorff 10

# One-dimensional QCD

- exact results reproduced
- discontinuity at  $\mu_c = 0$  in thermodynamic limit  $n \to \infty$



- sign problem severe when  $|\mu_c| < |\mu|$
- **s** condensate independent of  $\mu$ : Silver Blaze

# One-dimensional QCD

elegant analytical solution in thermodynamic limit:



# Troubled past

- 1. numerical problems: runaways, instabilities
  - $\Rightarrow$  adaptive stepsize

no instabilities observed, works for SU(3) gauge theory

GA, James, Seiler & Stamatescu 09

a la Ambjorn et al 86

2. theoretical status unclear

 $\Rightarrow$  detailed analyis, identified necessary conditions

GA, FJ, ES & IOS 09-12

- 3. convergence to wrong limit
  - $\Rightarrow$  better understood but not yet resolved

in progress

# Instabilities: heavy dense QCD

#### adaptive time step during the evolution



occasionally *very* small stepsize required can go to longer Langevin times without problems

## Analytical understanding

#### consider expectation values and Fokker-Planck equations

one degree of freedom x , complex action S(x) ,  $\rho(x) \sim e^{-S(x)}$ 

• wanted: 
$$\langle O(x,t) \rangle_{\rho} = \int dx \ \rho(x,t) O(x)$$
  
 $\partial_t \rho(x,t) = \partial_x \left( \partial_x + S'(x) \right) \rho(x,t)$ 

#### solved with CLE:

$$\langle O(x+iy,t)\rangle_P = \int dxdy \ P(x,y;t)O(x+iy)$$
  
 $\partial_t P(x,y;t) = \left[\partial_x \left(\partial_x - K_x\right) - \partial_y K_y\right] P(x,y;t)$ 

with  $K_x = -\text{Re}S'$ ,  $K_y = -\text{Im}S'$ 

• question:  $\langle O(x+iy,t)\rangle_P = \langle O(x,t)\rangle_\rho$  ?

# Analytical understanding

question:  $\langle O(x+iy,t)\rangle_P = \langle O(x,t)\rangle_\rho$  as  $t \to \infty$ ?

answer: yes, provided some conditions are met:

- In the second secon
- partial integration without boundary terms possible
- actually O(x + iy)P(x, y) for large enough set O(x)
- $\Rightarrow$  distribution should be sufficiently localized
  - can be tested numerically via criteria for correctness

$$\langle LO(x+iy)\rangle = 0$$

with *L* Langevin operator

0912.3360, 1101.3270

apply these ideas to 3D SU(3) spin model GA & James 11

- Searlier solved with complex Langevin Karsch & Wyld 85 Bilic, Gausterer & Sanielevici 88
- however, no detailed tests performed
- $\Rightarrow$  test reliability of complex Langevin using developed tools
  - analyticity in  $\mu^2$ :
    - from imaginary to real  $\mu$
    - Taylor series
  - criteria for correctness
  - Comparison with flux formulation Gattringer & Mercado 12

3-dimensional SU(3) spin model:  $S = S_B + S_F$ 

$$S_B = -\beta \sum_{\langle xy \rangle} \left[ P_x P_y^* + P_x^* P_y \right]$$
$$S_F = -h \sum_x \left[ e^\mu P_x + e^{-\mu} P_x^* \right]$$

- SU(3) matrices:  $P_x = \operatorname{Tr} U_x$
- gauge action: nearest neighbour Polyakov loops
- (static) quarks represented by Polyakov loops
- complex action  $S_F^*(\mu) = S_F(-\mu^*)$

effective model for QCD with static quarks, centre symmetry

#### phase structure



μ

effective model for QCD with static quarks

real and imaginary potential:

first-order transition in  $\beta - \mu^2$  plane,  $\langle P + P^* \rangle/2$ 



negative  $\mu^2$ : real Langevin — positive  $\mu^2$ : complex Langevin INT, August 2012 – p. 36

real chemical potential

immediate splitting between  $\langle P \rangle$  and  $\langle P^* \rangle$ : no Silver Blaze



inset: lines from first-order Taylor expansion

stepsize dependence

left:  $\langle P \rangle$  (top) and  $\langle P^* \rangle$  (bottom) at  $\mu = 3$ right: criteria for correctness  $\langle LO \rangle = 0$ 



improved stepsize algorithm to eliminate linear dependence criteria satisfied as stepsize  $\epsilon \rightarrow 0$ 

#### comparison with result obtained using flux representation



- CL: finite stepsize errors in lowest-order algorithm
- improved algorithm removes discrepancy in critical region

complex Langevin passes all the tests: why?

- Iocalized distribution: fast decay in imaginary direction
- real manifold is stable under small fluctuations
- Haar measure plays essential role
- $\Rightarrow$  Haar measure contribution to complex drift restoring

# Stabilizing drift

- Maar measure contribution to complex drift restoring
- controlled exploration of the complex field space

employ this: generate Jacobian by field redefinition

$$Z = \int dx \, e^{-S(x)} \qquad x = x(u) \qquad J(u) = \frac{\partial x(u)}{\partial u}$$
$$= \int du \, e^{-S_{\text{eff}}(u)} \qquad S_{\text{eff}}(u) = S(u) - \ln J(u)$$

drift:  $K(u) = -S'_{eff}(u) = -S'(u) + J'(u)/J(u)$ 

which field redefinition?

singular at J(u) = 0 but restoring in complex plane

# Fun with complex Langevin

Gaussian example: defined when  $\operatorname{Re}(\sigma) = a > 0$ 

$$Z = \int_{-\infty}^{\infty} dx \, e^{-\frac{1}{2}\sigma x^2} \qquad \sigma = a + ib \qquad \langle x^2 \rangle = \frac{1}{\sigma}$$

what if a < 0? flow in complex space for a = -1, b = 1:



left: highly unstable

right: after transformation  $x(u) = u^3$  attractive fixed points

# Fun with complex Langevin

do CLE in the *u* formulation and compute  $\langle x^2 \rangle = \langle u^6 \rangle$ 



CLE finds the analytically continued answer to negative *a*!

clearly needs more exploration – potential for stabilization – affects convergence

### XY model

#### three-dimensional XY model at nonzero $\mu$

$$S = -\beta \sum_{x} \sum_{\nu=0}^{2} \cos\left(\phi_{x} - \phi_{x+\hat{\nu}} - i\mu\delta_{\nu,0}\right)$$

•  $\mu$  couples to the conserved Noether charge

• symmetry 
$$S^*(\mu) = S(-\mu^*)$$

### unexpectedly difficult to simulate with complex Langevin!

numerics shares many features with heavy dense QCD

GA & James 10

also studied by Banerjee & Chandrasekharan using worldline formulation hep-lat/1001.3648

- comparison with known result (world line formulation)
- analytic continuation from imaginary  $\mu = i\mu_{I}$

real  $\mu$ , complex action:

$$S = -\beta \sum_{x} \sum_{\nu=0}^{2} \cos\left(\phi_{x} - \phi_{x+\hat{\nu}} - i\mu\delta_{\nu,0}\right)$$

imaginary  $\mu = i\mu_{\rm I}$ , real action:

$$S_{\rm I} = -\beta \sum_{x} \sum_{\nu=0}^{2} \cos(\phi_x - \phi_{x+\hat{\nu}} + \mu_{\rm I} \delta_{\nu,0})$$

 $\,$  real and imag  $\mu$  results analytic in  $\mu^2$ 

GA & James 10

- comparison with known result (world line formulation)
- analytic continuation from imaginary  $\mu = i \mu_{\mathrm{I}}$



• "Roberge-Weiss" transition at  $\mu_{\rm I} = \pi/N_{ au}$ 

- comparison with known result (world line formulation)
- analytic continuation from imaginary  $\mu = i \mu_{\rm I}$



Silver Blaze feature at small  $\beta$  and  $\mu$ 

XY MODEL

comparison with known result (world line formulation)

phase diagram:



phase boundary from Banerjee & Chandrasekharan

highly correlated with ordered/disordered phase

- apparent correct results in the ordered phase
- incorrect result in the disordered/transition region

diagnostics:

- distribution  $P[\phi_{\mathbf{R}}, \phi_{\mathbf{I}}]$  qualitatively different
- classical force distribution qualitatively different
- s complexified dynamics  $\neq$  real dynamics when  $\mu = 0$

but:

independent of strength of the sign problem

conclusion: failure not due to sign problem

# Summary

many stimulating results: examples where complex Langevin can handle

sign problem

- phase transition
- Silver Blaze problem
- thermodynamic limit

problems from the 80s:

- instabilities and runaways  $\rightarrow$  adaptive stepsize
- convergence: correct result not guaranteed

resolution in progress, important:

- failure does not depend on strength of sign problem
- distinct from all other approaches

QCD at nonzero  $\mu \quad \Leftrightarrow \quad \text{sign problem}$ 

relevant for QCD phase diagram, heavy-ion collisions, dense objects, ...

- sign problem has been studied from many perspectives
- 'well understood' (overlap, Silver Blaze, ...)
- no solution for QCD (yet ...)

sign problem appears not only in QCD

also in many (lower-dimensional, condensed matter) theories

 $\Rightarrow$  learn from those models as well

some approaches with limited applicability in full QCD:

- overlap preserving reweighting
- Taylor series
- imaginary  $\mu$  and analytical continuation

**\_** ...

**\_** 

partial or full solutions in not quite QCD:

- strong coupling QCD
- flux representations in spin models (not discussed)
- complex Langevin

to do (possible):

determine QCD phase diagram for

- imaginary chemical potential
- isospin chemical potential
- $\Rightarrow$  no sign problem
- $\Rightarrow$  large-scale numerical project
- $\Rightarrow$  intricate phase structure depending on quark masses

to do (possible?):

solve sign problem

don't give up!