The struggle against the sign problem

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XQCD 2017, Pisa, June 26, 2017



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Monte Carlo highly efficient: *importance sampling* $Prob(conf) \propto exp[-S(conf)]$

- But all low-hanging fruits have been picked by now
- Further progress requires tackling the "sign problem":

 $\exists \text{ conf s.t. "Boltzmann weight" exp}[-S(\text{conf})] \notin \mathbb{R}_{\geq 0}$

No probabilistic interpretation — Monte Carlo impossible??

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Real-time quantum evolution

dynamics of chemical reactions, protein folding, entanglement, ... limited to small systems / short times, or classical approximation weight in path integral $\propto \exp(-\frac{\mathbf{i}}{\hbar}Ht) \longrightarrow$ phase cancellations

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High T_c superconductivity: still mysterious after ~ 30 years Hubbard model: repulsion $Un_{\uparrow}n_{\downarrow} \xrightarrow{}_{\text{Hubbard-Stratonovich}} \det_{\uparrow} \det_{\downarrow}$

can be negative except at half-filling (particle-hole symmetry)

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QCD at non-zero density / chemical potential μ

integrate out the fermions $\det(\not\!\!D + \mu \gamma_0)^2 \ (N_f = 2)$

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Real > 0 "Boltzmann weight" is the exception rather than the rule

Interdisciplinary sign pb conferences, etc...

Computational complexity of the sign pb

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• How to study: $Z_{\rho} \equiv \int dx \ \rho(x), \ \rho(x) \in \mathbf{R}$, with $\rho(x)$ sometimes negative ? Reweighting: sample with $|\rho(x)|$ and "put the sign in the observable":

$$\langle W \rangle_f \equiv \frac{\int dx \ W(x)\rho(x)}{\int dx \ \rho(x)} = \frac{\int dx \ [W(x)\operatorname{sign}(\rho(x))] \ |\rho(x)|}{\int dx \ \operatorname{sign}(\rho(x)) \ |\rho(x)|} = \left| \frac{\langle W\operatorname{sign}(\rho) \rangle_{|\rho|}}{\langle \operatorname{sign}(\rho) \rangle_{|\rho|}} \right|$$

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"Figure of merit" Δf : measures severity of sign pb.

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More general factorization: $\rho = \rho_{MC} \times \frac{\rho}{\rho_{MC}}$ but (1) Δf increases, AND (2)... non-negative, used for sampling



Sign pb

Overlap pb

More difficulties: the overlap problem

• Further danger: insufficient overlap between sampled and reweighted ensembles

Very large weight carried by very rarely sampled states \rightarrow WRONG estimates in reweighted ensemble for finite statistics

• Example: sample
$$\exp(-\frac{x^2}{2})$$
, reweight to $\exp(-\frac{(x-x_0)^2}{2}) \rightarrow \langle x \rangle = x_0$?





Insufficient overlap ($x_0 = 5$)



Very non-Gaussian distribution of reweighting factor Log-normal Kaplan et al.

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Solution: Need stats $\propto \exp(\Delta S)$

Semantics: what does "solving the sign pb" mean?

• Idealist: "eliminate" the sign pb (ie. sign-pb-free representation of Z)

eg. flux ("dual") variables for complex bosonic field ϕ with chem. pot. integrate out the phase of ϕ (plays no explicit role in physical states)

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eg. flux ("dual") variables for complex bosonic field ϕ with chem. pot. integrate out the phase of ϕ (plays no explicit role in physical states)

• Pragmatist: "mollify" the sign pb

 $\langle \operatorname{sign} \rangle = \exp(-\frac{V}{T}\Delta f) \rightarrow \operatorname{reduce} \Delta f \rightarrow \operatorname{simulate} "large enough" volumes$

eg. lattice QCD with chemical potential in strong-coupling limit integrate out colored gauge links (plays no role in physical states,



except at short distance)

Compare with
$$\sim
ho_N(m_N-rac{3}{2}m_\pi)$$

 $ightarrow \Delta F$ reduced by $\sim 10^4$

General guiding principle ?

Steve Weinberg's Third Law of Progress in Theoretical Physics

You may use any degrees of freedom you like to describe a physical system, but if you use the wrong ones, you'll be sorry

in "Asymptotic realms of physics", 1983

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 Second Law: do not trust arguments based on lowest-order perturbation theory

• First Law: you will get nowhere by just churning equations

How to make the sign problem milder?

• Severity of sign pb. is representation dependent: generically, $Z = \text{Tr}e^{-\beta H} = \text{Tr}\left[e^{-\frac{\beta}{N}H}\left(\sum |\psi\rangle\langle\psi|\right)e^{-\frac{\beta}{N}H}\left(\sum |\psi\rangle\langle\psi|\right)\cdots\right]$ Any complete set $\{|\psi\rangle\}$ will do

If $\{|\psi\rangle\}$ form an eigenbasis of H, then $\langle\psi_k|e^{-\frac{\beta}{N}H}|\psi_I\rangle = e^{-\frac{\beta}{N}E_k}\delta_{kI} \ge 0 \rightarrow \text{no sign pb}$

• Strategy:

choose $\{|\psi\rangle\}$ "close" to physical eigenstates of H

without full-fledged diagonalization of *H* Strategy is general – "deep" optimization? tensor networks?

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Worse: are there(irreducible) sign problems?
 YES: when the partition function vanishes!

Example: spin system in complex magnetic field (Lee-Yang zeros of Z) Rindlisbacher & PdF



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Catalogue of approaches to bypass the QCD sign pb

• Analytic continuation from imaginary μ (no sign pb there): data is cheap How to control systematic error?? (fitting ansatz)

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- Taylor expansion in μ/T about $\mu = 0$:

limited info $\mu/T \lesssim 1$ cost of k^{th} coeff increases very steeply with ktechnical advances Gavai, Sharma, Schmidt,...

Catalogue of approaches to bypass the QCD sign pb

- Analytic continuation from imaginary μ (no sign pb there): data is cheap How to control systematic error?? (fitting ansatz)
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- Density of states:

 $S = S_R + iS_I$; select one observable eg. $S_I \rightarrow Z_x = \int \mathcal{D}Ue^{-S_R}\delta(S_I - x)$ $Z = \int dx Z_x e^{ix}$, i.e. Fourier transform old: Gocksch (1988), Fodor Katz & Schmidt, 2007, ... significant progress: Langfeld, Lucini & Rago, 2012 Solves overlap pb consensus(?): data alone not accurate enough to beat sign pb: need "smoothing" or "fitting" ansatz LLR; Gattringer \rightarrow bias PdF & Rindlisbacher, XQCD 2016

e.g. gauge field: $A_{\mu}
ightarrow A^R_{\mu} + i A^I_{\mu}$ S extended by analytic continuation

- QCD problem I:
 S is not analytic: log det(\$\vec{D}\$) has poles and is multi-valued
- QCD problem II: gauge group $SU(3) \rightarrow SL(3, C)$, departure from $SU(3) \sim A'_{\mu}$ SL(3, C) gauge transformations \Rightarrow flat directions $A_{\mu} \rightarrow i\infty$ \Rightarrow runaway solutions; large, diverging force; roundoff error; etc.. • gauge cooling Seiler, Sexty & Stamatescu • irrelevant (?) SU(3)-restoring force Attanasio & Jäger

Hope: find probability $P(A_{\mu}^{R}, A_{\mu}^{\prime}) \in \mathcal{R}^{+}$ in complexified space, which yields correct vevs for all observables

• Intelligent design: construct "representation" $P(A_{\mu}^{R}, A_{\mu}^{I}) \in \mathcal{R}^{+}$ such that $\langle W(A_{\mu}^{R}) \rangle_{\exp(-S_{R}-iS_{I})} = \langle W(A_{\mu}^{R} + iA_{\mu}^{I}) \rangle_{P} \quad \forall W \quad \text{Salcedo, Wosiek}$ Example: $S = (x - i)^{2} \rightarrow P(x, y) = \delta(y - 1) \exp(-x^{2})$

Finding suitable "representation" more difficult than solving the sign problem?

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Finding suitable "representation" more difficult than solving the sign problem?

- Complex Langevin: *conjecture* by Parisi and by Klauder, 1983
 S complex → complex drift force ∇S, + complex noise
 Outcomes: runaway, convergence to correct or to wrong answers
 When does complex Langevin give correct results?
- infinite set of conditions (Seiler et al) not practical
- no boundary in parameter space separating correct and wrong results \rightarrow always wrong? Kogut & Sinclair?
- real noise only
- may give wrong answers in the absence of sign pb (3d XY model,

Aarts & James, 2010)

• Lefschetz thimble:

Idea: deform integration contour in the complex plane, such that $S_I = \text{constant} \rightarrow \approx \text{constant phase}$ - do NOT explore full complexified space (\leftrightarrow complex Langevin) - to find the thimble: start at saddle point $\partial_z S(z) = 0$ keep S_I fixed move to increase S_R (steepest ascent) - IF one thimble, then constant phase e^{iS_I} cancels in vevs residual, mild sign pb from Jacobian along [not straight] thimble technical difficulty of sampling along thimble can be overcome Di Renzo et al, Tanizaki et al, Fujii et al, Bedaque et al

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Problem: number of thimbles $\sim \exp(\text{Volume})$?

- Keep dominant thimble only (OK as $V
 ightarrow \infty$?) but, eg. phase transitions??
- Keep all thimbles: relative phase \rightarrow sign pb reappears

- ergodic sampling?

• Holomorphic gradient flow: Alexandru, Bedaque et al, 1512.08764,...

Idea: tuning knob (flow time) to interpolate between real manifold and thimble

• $t = 0 \rightarrow \text{original field } \phi$

•
$$t > 0 \rightarrow \frac{d\phi}{dt} = \frac{\partial S}{\partial \phi}$$

Along flow, S_I remains constant, and S_R keeps increasing ie. $\exp(-S_R)$ keeps decreasing, except for critical points $\partial S/\partial \phi = 0$ \implies approach Lefschetz thimbles as $t \to \infty$



Note: sign pb requires $\exp(V)$ resources, ergodicity pb ALSO \rightarrow don't expect "sweet spot" to beat $\exp(V)$ complexity – only Δf smaller

• Reason for optimism: real-time quantum dynamics 1605.08040

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Catalogue of approaches to bypass the QCD sign pb: a sobering story (Ph.D. thesis, Slavo Kratochvila, ETH, 2005)

• Toy problem: estimate $\langle W(\lambda) \rangle = \frac{\int_{-\infty}^{+\infty} dx \ e^{-x^2 + i\lambda x}}{\int dx \ e^{-x^2}}$

Exact answer: $\langle W(\lambda) \rangle = \langle e^{i\lambda x} \rangle_{\lambda=0} = e^{-\lambda^2/4} \rightarrow \text{exponentially large cancellations}$

• One approach: deformation of contour in the complex plane Note saddle points: $x = i\lambda/2$ (numerator) and x = 0 (denominator)

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- One approach: deformation of contour in the complex plane Note saddle points: $x = i\lambda/2$ (numerator) and x = 0 (denominator)
- Observation: optimum is to go through $x = i\lambda/4$, i.e. neither saddle point! Why? Moving the contour away from real axis renders denominator oscillatory

Sign problem is shifted between numerator and denominator! Optimum contour is a compromise (half-way between the two saddle points) which depends on observable *W*

Lesson for realistic problems:

an innocent observable may become oscillatory when analytically continued \rightarrow danger of simply reshuffling the sign pb from Z to W

cf. optimization of contour via cost-function Ohnishi et al, 1705.05605



The struggle continues...

Backup

 QCD: sample with |Re(det(μ)^{N_f})| optimal, but not equiv. to Gaussian integral Can choose instead: |det(μ)|^{N_f}, i.e. "phase quenched" |det(μ)|^{N_f} = det(+μ)^{N_f/2} det(-μ)^{N_f/2}, ie. isospin chemical potential μ_u = -μ_d couples to ud̄ charged pions ⇒ Bose condensation of π⁺ when |μ| > μ_{crit}(T)

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$$\frac{Z_{\text{QCD}}(\mu)}{Z_{|\text{QCD}|}(\mu)} = e^{-\frac{V}{T}[f(\mu_u = +\mu, \mu_d = +\mu) - f(\mu_u = +\mu, \mu_d = -\mu)]}$$
 (for $N_f = 2$)



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Alternative at $T \approx 0$: $\mu = 0 + baryonic sources/sinks$



• Mitigated with variational baryon ops. $\rightarrow m_{eff}$ plateau for 3 or 4 baryons ? Savage et al., 1004.2935 At least 2 baryons \rightarrow nuclear potential Aoki, Hatsuda et al., eg. 1007.3559

• Beautiful results with up to $12 \rightarrow 72$ *pions or kaons* Detmold et al., eg. 0803.2728 (cf. isospin- μ : no sign pb.)