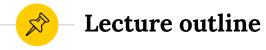
Introduction to lattice quantum chromodynamics

CFNS Summer School 2022



William & Mary





Lecture 1

- Path integrals and lattice field theory
- Quantum chromodynamics

Lecture 2

- Spin models
- Numerical integration
- Monte Carlo methods

Lecture 3

- Gauge field Monte Carlo
- Correlation functions



- Lattice field theory provides rigorous definition of nonperturbative QFT
- QCD describes fundamental interactions of the strong nuclear force in terms of quarks and gluons
- Lattice QCD formulated with quarks on the lattice sites and SU(3) link variables representing gluons
- Gluon action built from closed loops of link variables, such as plaquettes
- Fermions on the lattice suffer from fermion doubling; intimately connected to existence of chiral fermions in a regulated theory
- Different discretisations possible, but any choice should lead to QCD in the continuum limit of vanishing lattice spacing



- Numerical evaluation of high-dimensional integrals requires Markov chain Monte Carlo
- Markov chain Monte Carlo consists of two basic steps
 - propose local update
 - accept/reject update
- Local-update algorithms suffer large autocorrelations use global-update algorithms
- Global-update algorithms work well near phase transitions

3.1

Monte Carlo for gauge theories

From Metropolis to hybrid Monte Carlo

QCD on the lattice



Reminder: QCD in the continuum

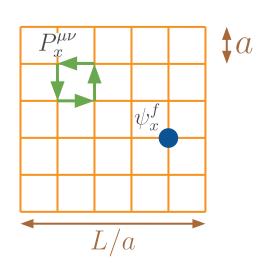
$$\mathcal{L}_{\text{QCD}} = -\frac{1}{4} F_{\mu\nu}(x) F^{\mu\nu}(x) + \sum_{f} \overline{\psi}_{f}(x) \left[\gamma_{\mu} D^{\mu} + m_{f} \mathbb{I} \right] \psi_{f}(x)$$

QCD on the lattice

$$\mathcal{L}_{LQCD} = \mathcal{L}_g(U_x) + \sum_f \overline{\psi}_y^f D_{yx}(U) \psi_x^f$$

Path integrals are numerical integrals

$$\langle 0|\overline{\psi}\psi|0\rangle = \int \mathcal{D}U\,\overline{\psi}\psi\,\mathrm{det}D(U)\,e^{-\mathcal{S}_{LQCD}[\overline{\psi},\psi,U]}$$



QCD on the lattice

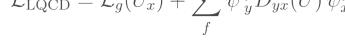


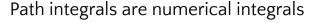
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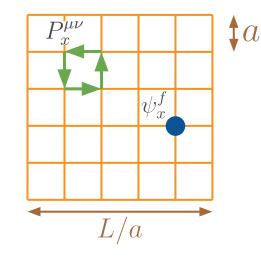
QCD on the lattice

$$\mathcal{L}_{LQCD} = \mathcal{L}_g(U_x) + \sum_f \overline{\psi}_y^f D_{yx}(U) \psi_x^f$$





$$\langle 0|\overline{\psi}\psi|0\rangle = \int \mathcal{D}U\,\overline{\psi}\psi \det D(U)\,e^{-\mathcal{S}_{LQCD}[\overline{\psi},\psi,U]}$$





Monte Carlo for gauge theories



Need to adapt our Monte Carlo methods for gauge theories

Ising model updated (by flipping or otherwise) spins

$$\langle f_{\beta} \rangle = \sum_{\sigma} f(\sigma) P_{\beta}(\sigma) = \frac{1}{Z_{\beta}} \sum_{\sigma} f(\sigma) e^{-\beta H(\sigma)}$$

- For gauge theories we need to update links (group elements/matrices)

$$\langle \mathcal{O} \rangle = \frac{1}{Z} \int \mathcal{D}U \, \mathcal{O}[U] \exp \left[-S_{\text{Latt.}}[U(x)] \right]$$

Need to do this in a way that maintains gauge invariance

Formally, the integration measure is the Haar measure

Metropolis algorithm



- 1. Generate a uniformly distributed random number random SU(3) matrix
- 2. Modify the value at a specific lattice site on a specific link $U_{\mu} \to M U_{\mu}$
- 3. Calculate the change in the action generated by this modification
- 4. I

$$\Delta S < 0$$

accept the change and move on to the next site [return to 1.]

5. Else if

$$\Delta S > 0$$

generate a new random number

$$\eta \in (0,1)$$

6. It

$$\exp\left[-\Delta S\right] > \eta$$

accept the change, otherwise reject the change

7. Move on to the next site [return to 1.]

Metropolis algorithm



Comments:

- 1. Usually the random SU(3) matrices are generated beforehand
 - variety of methods
- 2. Set of approximately 100 random *SU(3)* matrices is sufficient, if:
- 3. Updates are local, so multiple sites can be updated simultaneously
- 4. Multiple updates to a single site usually carried out before moving sites
- 5. Link re-unitarization required to avoid propagation of round-off errors
 - each matrix has an inverse within the set
 - set spans *SU(3)* through matrix multiplication

Molecular dynamics: the idea



Recast the Euclidean path integral as Hamiltonian dynamics

Basic idea:

 $\mathbb{I} = \int \frac{\mathrm{d}p}{\sqrt{2\pi}} \, e^{-p^2/2}$

1. Insert the identity (field)

$$P(\phi) = \int \mathcal{D}\phi \, e^{-S_{\rm E}[\phi]} = \int \mathcal{D}\phi \, \int \mathcal{D}p \, e^{-p^2/2} e^{-S_{\rm E}[\phi]} = \int \mathcal{D}\phi \, \int \mathcal{D}p \, e^{-\frac{1}{T}H[\phi,p]}$$

2. Dynamics now captured by Hamilton's equations in **enlarged phase space**

$$\dot{\phi}(x) = -\frac{\partial H[\phi, p]}{\partial p}$$
 $\dot{p}(x) = -\frac{\partial H[\phi, p]}{\partial \phi}$

Fields evolve in a new dimension - molecular dynamics time

Molecular dynamics: the formalism



Introduce momenta conjugate to link variables and Hamiltonian

$$H[\pi, U] = \frac{1}{2}\pi_{\mu}(x)\pi^{\mu}(x) + S[U(x)]$$

that defines classical evolution in molecular dynamics time

$$\frac{\partial \pi_{\mu}^{a}(x)}{\partial \tau} = -\frac{\partial S[e^{\omega}U(x)]}{\partial \omega_{\mu}^{a}(x)} \qquad \frac{\partial U_{\mu}(x)}{\partial \tau} = \pi^{\mu}(x)U_{\mu}(x)$$



Follows from Liouville theorem

Corresponding set of all trajectories is area preserving, with

$$Z = \int \mathcal{D}\pi \,\mathcal{D}U \, \exp\left[-H[\pi, U]\right]$$

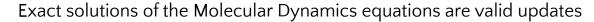
Assuming ergodicity, probability of visiting a specific link variable along a classical trajectory is

$$\exp\left[-S[U(x)]\right]$$

Ensemble averages are replaced by trajectory averages

$$\langle \mathcal{O} \rangle = \frac{1}{\tau} \int_{\tau_0}^{\tau_0 + \tau} d\tau \, \mathcal{O}[U[\tau]]$$

Hybrid Monte Carlo



Of course, any numerical solution is not exact - introduce hybrid Monte Carlo (HMC)

View molecular dynamics evolution as a Metropolis update proposal

Apply usual accept/reject step following this update

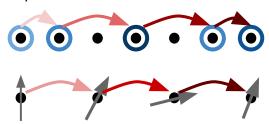
Comments:

- Accept/reject step ensures Molecular Dynamics step satisfies detailed balance even for finite numerical integration step size
- Acceptance rate decreases exponentially with system size
- Higher order integrators do not seem to help
- Sampling efficiency can be improved by drawing new momenta "refreshed molecular dynamics"
- Requires time-reversal invariant and symplectic numerical integration algorithm, e.g leap-frog algorithm



Hybrid Monte Carlo algorithm

- 1. Generate initial configuration of link variables
- 2. Choose conjugate momenta from a Gaussian distribution
- 3. Evolve links and momenta via **Molecular Dynamics** step [leap frog]:
 - a. Evolve momenta by one half time-step
 - b. Evolve link variables by one time step
 - c. Repeat for desired number of iterations, ending with a.



4. Accept new configuration with usual Metropolis probability

$$P = \min \left\{ 1, \exp \left[-\Delta H[\pi, U] \right] \right\}$$

Return to 2.



- Gauge configuration algorithms are more sophisticated than spin models
- Should maintain gauge invariance and cannot take advantage of cluster algorithms
- Examples:
 - Metropolis, hybrid Monte Carlo
- State-of-the-art algorithms mix methods (i.e. use a lot of jargon)
 - e.g. hybrid Monte Carlo with refreshed molecular dynamics and an Omelyan integrator

3.2

Constructing correlation functions

From correlators to cross-sections

Two point functions on the lattice



Two-point functions correspond to the propagators of the theory



i.e. the set of all energy states of the theory

They encode the **spectrum** of the theory

$$\begin{split} \langle O|\hat{\phi}(t)\hat{\phi}(0)|0\rangle &= \langle 0|e^{it\hat{H}}\hat{\phi}(0)e^{-it\hat{H}}\hat{\phi}(0)|0\rangle \\ &= \langle 0|\hat{\phi}(0)e^{-it\hat{H}}\sum_{n}|n\rangle\langle n|\hat{\phi}(0)|0\rangle \\ &= \sum_{n}|n\rangle\langle n|\hat{\phi}(0)|0\rangle \end{split}$$

In Euclidean spacetime, this becomes

$$\langle O|\hat{\phi}(t)\hat{\phi}(0)|0\rangle = \sum e^{-tE_n} \left| \langle 0|\hat{\phi}(0)|n\rangle \right|^2 \stackrel{t\to\infty}{\to} e^{-tE_1} \left| \langle 0|\hat{\phi}(0)|1\rangle \right|^2$$

Hadrons on the lattice I



Lattice QCD is a nonperturbative formulation of QCD - observable states are those of QCD!

Need to construct interpolating operators - operators that create hadrons of specific quantum numbers



Example: the pion

Construct a pseudoscalar quark-antiquark pair

$$\mathcal{O}_x^{\pi} = \overline{\psi}_x^{u/d} \gamma_5 \, \psi_x^{u/d}$$

then the two-point function is

$$\langle 0 | \sum_{\mathbf{v}} \mathcal{O}_{\mathbf{y},t}^{\pi} \cdot \mathcal{O}_{\mathbf{x},0}^{\pi} | 0 \rangle \stackrel{t \to \infty}{\to} e^{-m_{\pi}t} | \langle 0 | \mathcal{O}_{\mathbf{x},0}^{\pi} | \pi \rangle |^{2}$$



sum over space projects out pion at rest



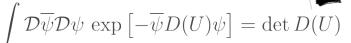
Interpolating operators create *all* states with the same quantum numbers

In the absence of electromagnetism, up and down quarks are only distinguished by their mass. But relative to the other scales of QCD, their masses can treated as **degenerate**. High-precision results (-0.5%) require **isospin breaking corrections** to account for effects of electromagnetism and quark mass splitting.

Hadrons on the lattice II



recall: Gaussian integral



To do this in practice, we need some more **Grassmann integrals**

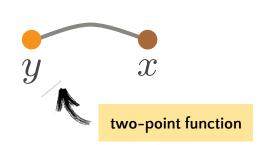
$$\int \mathcal{D}\overline{\psi}\mathcal{D}\psi\,\psi_y\overline{\psi}_x\exp\left[-\overline{\psi}D(U)\psi\right] = D_{yx}^{-1}\mathrm{det}\,D(U) \qquad \qquad D_{yx}\psi_x^f = 0 \qquad \qquad \text{recall: lattice Dirac operator}$$

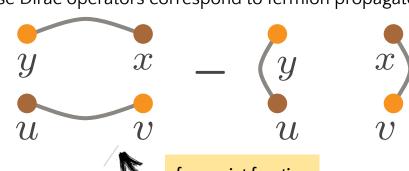


which we can generalise to larger numbers of fermion fields

$$\int \mathcal{D}\overline{\psi}\mathcal{D}\psi \,\psi_y \overline{\psi}_x \psi_v \overline{\psi}_u \exp\left[-\overline{\psi}D(U)\psi\right] = \left[D_{yx}^{-1}D_{vu}^{-1} - D_{yu}^{-1}D_{vx}^{-1}\right] \det D(U)$$

This is basically Wick's theorem, but our inverse Dirac operators correspond to fermion propagators





Mesons on the lattice



Example: the pion two-point function

$$\mathcal{O}_x^{\pi} = \overline{\psi}_x^{u/d} \gamma_5 \, \psi_x^{u/d}$$

Construct pseudoscalar quark-antiquark pairs at two different time slices

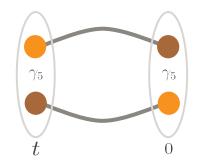
$$\langle 0 | \sum_{\mathbf{y}} \mathcal{O}_{\mathbf{y},t}^{\pi} \cdot \mathcal{O}_{\mathbf{x},0}^{\pi} | 0 \rangle = \int \mathcal{D}U \mathcal{D}\psi \mathcal{D}\overline{\psi} \sum_{\mathbf{y}} \mathcal{O}_{\mathbf{y},t}^{\pi} \cdot \mathcal{O}_{\mathbf{x},0}^{\pi} e^{-\mathcal{S}_{g}[U]} e^{-\overline{\psi}D[U]\psi}$$

Evaluate the fermion integral exactly

$$\left\langle 0 \middle| \sum_{\mathbf{y}} \mathcal{O}_{\mathbf{y},t}^{\pi} \cdot \mathcal{O}_{\mathbf{x},0}^{\pi} \middle| 0 \right\rangle = \int \mathcal{D}U \operatorname{Tr} \left[\gamma_5 D_{\mathbf{y}t,\mathbf{x}0}^{-1} \gamma_5 D_{\mathbf{x}0,\mathbf{y}t}^{-1} \right] \det D[U] e^{-\mathcal{S}_g[U]}$$

And approximate the gauge integral via Markov chain Monte Carlo

$$\langle 0 | \sum_{\mathbf{y}} \mathcal{O}_{\mathbf{y},t}^{\pi} \cdot \mathcal{O}_{\mathbf{x},0}^{\pi} | 0 \rangle \approx \frac{1}{N_{\text{conf}}} \sum_{m=1}^{N_{\text{conf}}} \text{Tr} \left[\gamma_5 D_{\mathbf{y}t,\mathbf{x}0}^{-1} \gamma_5 D_{\mathbf{x}0,\mathbf{y}t}^{-1} \right]$$



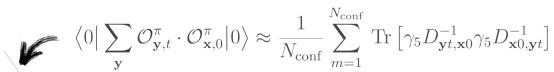


Summary: lattice calculation procedure

- 1. Generate an **ensemble** of gauge **configurations** (sets of gluon link variables) on a **finite volume**, **discretised**, **Euclidean spacetime lattice**
- 2. Calculate inverse of Dirac matrix (which is a function of the gluon links) on each configuration, at fixed times
- 3. Calculate appropriate trace (gamma matrix structure given by interpolating operator)
- 4. Average results from all configurations
- 5. Repeat from 2. at different times
- 6. Result:

numerical data (with statistical uncertainties) as a function of Euclidean time

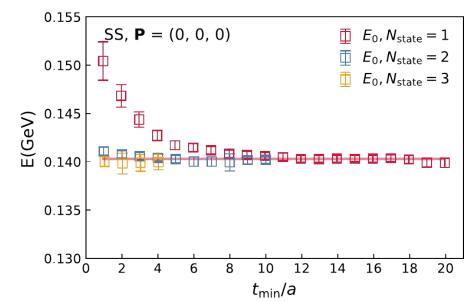
Sample results







Example: the pion two-point function



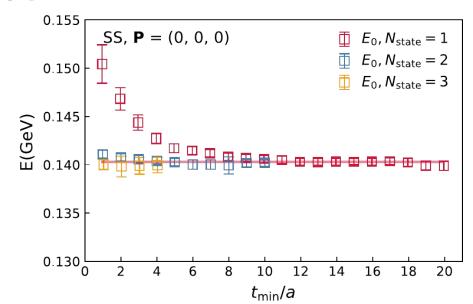
Sample results







Example: the pion two-point function



$$C_{2}(t) = \langle 0 | \mathcal{O}_{t}^{\pi} \cdot \mathcal{O}_{0}^{\pi} | 0 \rangle$$

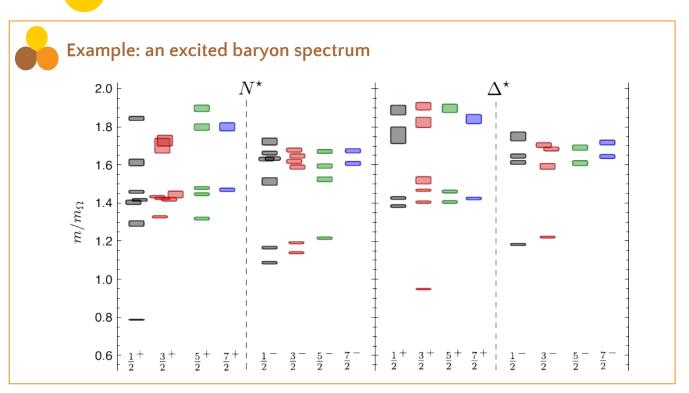
$$= \langle 0 | e^{tH} \mathcal{O}_{0}^{\pi} e^{-tH} \cdot \mathcal{O}_{0}^{\pi} | 0 \rangle$$

$$= \langle 0 | \mathcal{O}_{0}^{\pi} e^{-tH} \sum_{n} | n \rangle \langle n | \mathcal{O}_{0}^{\pi} | 0 \rangle$$

$$= \sum_{n} e^{-tE_{n}} \langle 0 | \mathcal{O}_{0}^{\pi} | n \rangle \langle n | \mathcal{O}_{0}^{\pi} | 0 \rangle$$

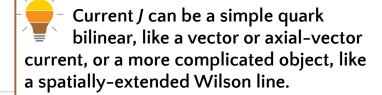
$$= \sum_{n} e^{-tE_{n}} |A_{n}|^{2} \xrightarrow{t \to \infty} A_{0} e^{-m_{\pi}t}$$

Sample results: two-point functions and the meson spectrum

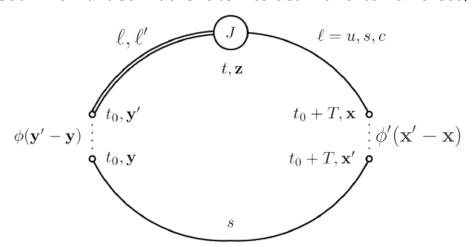








Two point functions encode a lot of physics and provide rich information on the hadron spectrum But if we want our hadrons to interact with external forces, we need **three-point functions**





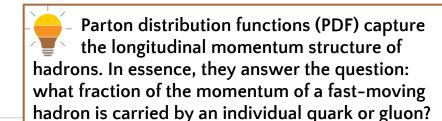
insert a probe operator (or *current*) with the relevant quantum numbers

$$C_{2}(t) = \langle 0 | \mathcal{O}_{t}^{\pi} \cdot \mathcal{O}_{0}^{\pi} | 0 \rangle$$

$$= \sum_{n} e^{-tE_{n}} \langle 0 | \mathcal{O}_{0}^{\pi} | n \rangle \langle n | \mathcal{O}_{0}^{\pi} | 0 \rangle$$

$$= \sum_{n} e^{-tE_{n}} |A_{n}|^{2}$$

Spectral analysis of three-point functions more complicated, follows the same logic as two-point function Physics typically encoded in **matrix elements**, which capture overlap of operator with energy eigenstates







Example: the unpolarised gluon PDF of the nucleon

Need to calculate the three-point function

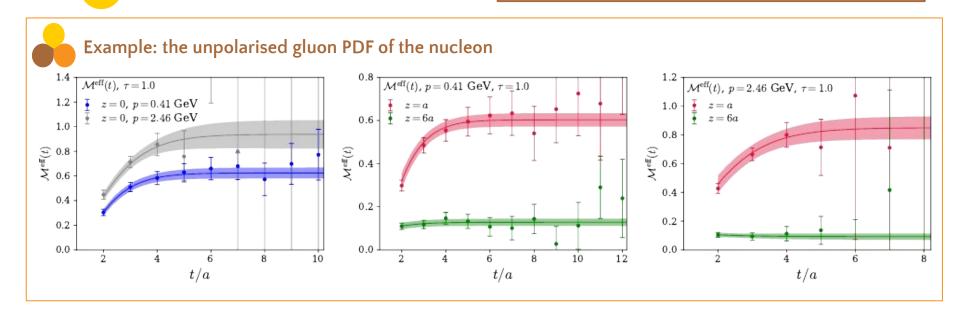
$$\langle C_{3pt}(t, t_g) \rangle = \langle 0 | \mathcal{T} \{ \mathcal{O}_N(t) \, O_g(t_g) \, \bar{\mathcal{O}}_N(0) \} | 0 \rangle$$

of the gluon operator

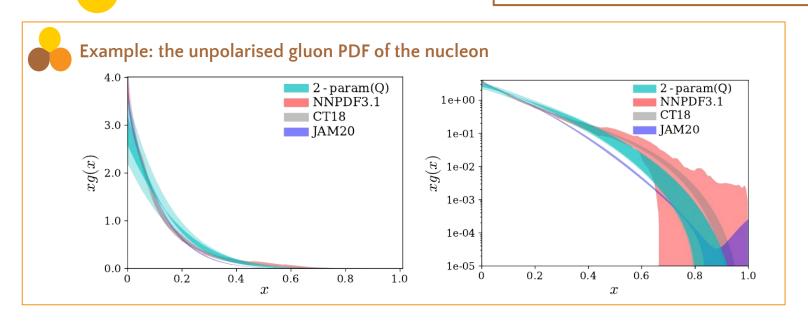
$$O_g(z) = G_{ji}(z) U(z,0) G_{ij}(0) U(0,z) - G_{ti}(z) U(z,0) G_{it}(0) U(0,z)$$

with U(x,y) the Wilson line between x and y, in the adjoint representation.

Parton distribution functions (PDF) capture the longitudinal momentum structure of hadrons. In essence, they answer the question: what fraction of the momentum of a fast-moving hadron is carried by an individual quark or gluon?



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 - numerical data (with statistical uncertainties) as a function of Euclidean time
- 7. Extract physics from noisy data at large Euclidean times

statistical uncertainties



Summary: lattice systematic uncertainties

finite volume effects

lattice spacing effects

volume, discretised, Euclidean spacetime lattice

Generate an ensemble of gauge configurations (sets of gluon link variables) on a finite

 Calculate inverse of Dirac matrix (which is a function of the gluon links) on each configuration, at fixed times

cannot access real-time or light-cone quantities

- 3. Calculate appropriate trace (gamma matrix structure given by interpolating operator)
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signal-to-noise issues

excited state contamination



- Lattice field theory provides rigorous definition of nonperturbative QFT
- QCD describes fundamental interactions of the strong nuclear force in terms of quarks and gluons
- Lattice QCD formulated with quarks on the lattice sites and *SU(3)* link variables representing gluons
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- Different discretisations possible, but any choice should lead to QCD in the continuum limit of vanishing lattice spacing



- Numerical evaluation of high-dimensional integrals requires Markov chain Monte Carlo
- Markov chain Monte Carlo consists of two basic steps
 - propose local update
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- Local-update algorithms suffer large autocorrelations use global-update algorithms
- Global-update algorithms work well near phase transitions



- Gauge configuration algorithms
 - Metropolis, hybrid Monte Carlo
- Basic lattice procedure:
 - 1. Generate configurations
 - 2. Calculate correlation functions (inverting the Dirac operator)
 - 3. Average over configurations to provide estimate of path integral
 - 4. Extract physics from long Euclidean-time limit
- Two-point functions encode hadron spectrum
- Interactions with external forces given by three-point functions
- x-dependent hadron structure requires more complicated operator insertions



Thank you

Questions?

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Generating SU(3) matrices

Method 1:

- 1. Generate a 3×3 matrix A with complex entries a_i , such that $\text{Re}\{a_i\}$, $\text{Im}\{a_i\}\in (-1,1)$.
- 2. Define the Hermitian matrix $H = (A + A^{\dagger})/2$.
- 3. Define the exponentiated matrix

$$M = \exp[i\epsilon H] = 1 + i\epsilon H - \frac{\epsilon^2}{2}H^2 + \cdots$$

- 4. Apply the Gram-Schmidt procedure to unitarize M:
 - (a) Let $U = (u_1, u_2, u_3)$ and $M = (m_1, m_2, m_3)$, where the u_i and m_i represent the columns of U and M, respectively.
 - (b) Set $u_1 = m_1$.
 - (c) Set

$$u_2 = m_2 - \frac{u_1 \cdot m_2}{|u_1|^2} u_1.$$

(d) Set

$$u_3 = m_3 - \frac{u_1 \cdot m_3}{|u_1|^2} u_1 - \frac{u_2 \cdot m_3}{|u_2|^2} u_2.$$

(e) Normalize U.

Generating SU(3) matrices

Method 2: This method will generate random matrices within a given "distance" ϵ of the identity, in SU(3) space:

- 1. Generate eight random numbers $x_i \in (-1,1)$.
- 2. If

$$\sum_{i=1}^{8} x_i^2 < 1,$$

then define

$$y_i = \frac{\epsilon}{|x|} x_i,$$

otherwise generate eight new random numbers and repeat until Equation (21) is satisfied.

3. Construct the Hermitian SU(3) matrix

$$H = \sum_{i=1}^{8} y_i \tau_i$$

where τ_i are the Gell-Mann matrices, the generators of SU(3).

4. Define $U = \exp(iH)$.

Heatbath algorithm



Basic procedure:

- 1. Visit each link
- Replace variable with probability

$$P(U) \propto \exp\left[\beta \operatorname{Re} \operatorname{Tr} X^{\dagger} U\right]$$

In essence: approximate local region as a heat bath with thermal distribution governed by the "local action"

For *SU(2)*

- Creutz-Pendleton-Kennedy algorithm
- works very well

For *SU(3)*

- algorithm exists but is impractical
- "pseudo-heatbath" preferable
- "overrelaxation" methods even better

Creutz, PRD 21 (1980) 2308 Pendleton & Kennedy, PLB 143 (1984) 459

Pietarinen, NPB 190 (1981) 349

Cabibbo & Marinari, PLB 119 (1982) 387

Adler, PRD 23 (1981) 2901 de Forcrand & Jahn, hep-lat/0503041

Split Hamiltonian

$$H[\pi, U] = \frac{1}{2}\pi_{\mu}(x)\pi^{\mu}(x) + S[U(x)] = T[\pi(x)] + S[U(x)]$$

Solve time evolution separately
$$T_U=e^{\tau\widehat{T}} \qquad T_\pi=e^{\tau\widehat{S}}$$

$$U(x,\tau)=e^{\pi\tau}U(x,0) \qquad U(x,\tau)=U(x,0)$$

$$\pi(\tau)=\pi(0) \qquad \pi(\tau)=\pi(0)-\tau F$$

Update steps can be carried out in any order

- Evolve momenta by one half time-step
- Evolve link variables by one time step
- Repeat for desired number of iterations, ending with a.









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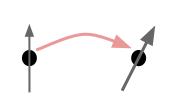
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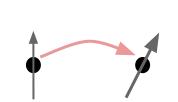
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Split Hamiltonian

$$H[\pi, U] = \frac{1}{2}\pi_{\mu}(x)\pi^{\mu}(x) + S[U(x)] = T[\pi(x)] + S[U(x)]$$

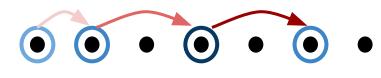
Solve time evolution separately
$$T_U=e^{\tau\widehat{T}} \qquad T_\pi=e^{\tau\widehat{S}}$$

$$U(x,\tau)=e^{\pi\tau}U(x,0) \qquad U(x,\tau)=U(x,0)$$

$$\pi(\tau)=\pi(0) \qquad \qquad \pi(\tau)=\pi(0)-\tau F$$

Update steps can be carried out in any order

- Evolve momenta by one half time-step
- Evolve link variables by one time step
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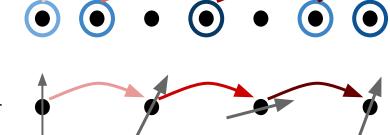
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Improved Hybrid Monte Carlo

Leapfrog algorithm is robust but not optimal

Accept/reject rate depends on magnitude of the error in the total energy

Leapfrog time evolution (second order integrator)

$$T = \left[T_U \left(\frac{\epsilon}{2} \right) T_\pi \left(\epsilon \right) T_U \left(\frac{\epsilon}{2} \right) \right]^N$$

Omelyan integrator

$$T = \left[T_{\pi} \left(\epsilon \lambda \right) T_{U} \left(\frac{\epsilon}{2} \right) T_{\pi} \left(\epsilon (1 - 2\lambda) \right) T_{U} \left(\frac{\epsilon}{2} \right) T_{\pi} \left(\epsilon \lambda \right) \right]^{N/2}$$

 λ = 0.19 performs about twice as well as the leapfrog algorithm, even though the optimised integrator has twice the computational cost

- Actually, the optimal value is apparently
$$(2, \sqrt{326} + 36)^{1/3}$$

$$\lambda_c = \frac{1}{2} - \frac{(2\sqrt{326} + 36)^{1/3}}{12} + \frac{1}{(6\sqrt{326} + 36)^{1/3}} \approx 0.1931833275037836$$