Applications of Geometric Cluster Algorithms

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Outline:

- 1. Cluster Monte Carlo
- 2. Proof of detailed balance
- 3. The geometric cluster method
- 4. Fisher renormalization
- 5. Conclusion

Contributions from:

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1) Cluster Monte Carlo

Local updates at criticality are *slow*. Autocorrelation time τ_L vs. system size *L*:

$\tau_L \propto L^z$

Computer time $\propto L^{d+z}$ per independent configuration in d dimensions. Typically, $z \approx 2$ for local updates:

z = 2.1665(2) for 2-d Ising model (Metropolis)

However, see also

z = 3.75 for 2-d Ising model (Kawasaki dynamics)

and

z = 0 for the percolation problem.

In general, critical slowing down restricts simulation to small L. Local Ising update according to Metropolis:

i) select particle in state s_i ii) propose new state $s'_i = -s_i$ iii) calculate energy change ΔE iv) if $\Delta E \leq 0$, accept new state s'_i ; if $\Delta E > 0$, accept new state with probability $e^{-\Delta E/k_{\rm B}T}$.

spin is flippable if $\Delta E \leq 0$, and if $\Delta E > 0$ it is flippable with probability $e^{-\Delta E/k_{B}T}$.

Cluster Monte Carlo:

Ferro Potts model: Swendsen-Wang algorithm. Clusters: groups of spins connected by rigid bonds. Bonds: not rigid if they connect unequal spins. Equal spins: rigid with probability $1 - e^{-K}$ with $\Delta E/k_{\rm B}T = \pm K$. Similarity with local updates:

bond is flippable if $\Delta E \leq 0$; if $\Delta E > 0$, flippable with probability $e^{-\Delta E/k_BT}$.

2) Detailed Balance

Consider single-cluster version (Wolff): Cluster C: all sites connected by rigid bonds. Flip cluster C: configuration $\Gamma \rightarrow \Gamma'$



Probability of this cluster flip:

 $T(\Gamma', \Gamma) = P_{\text{internal}}(\Gamma, \mathcal{C}) P_{\text{boundary}}(\Gamma, \mathcal{C})$

 P_{internal} : probability that all sites in C are connected;

 P_{boundary} : that no site outside C is connected.

Thus $P_{\text{boundary}} = \exp[-\sum^{+} \Delta E / k_{\text{B}}T]$

where $\sum^{+} \Delta E$ collects the energy changes of bonds whose energy *increases* when $\Gamma \rightarrow \Gamma'$. Next: probability of inverse flip $\Gamma' \rightarrow \Gamma$:

$$T(\Gamma, \Gamma') = P_{\text{internal}}(\Gamma', \mathcal{C})P_{\text{boundary}}(\Gamma', \mathcal{C})$$

or

$$T(\Gamma, \Gamma') = P_{\text{internal}}(\Gamma, C) \exp[-\sum^{+} \Delta E' / k_{\text{B}}T]$$

where $\sum^{+} \Delta E'$ collects the energy changes of bonds whose energy *increases* when $\Gamma' \rightarrow \Gamma$. Thus

$$T(\Gamma, \Gamma') = P_{\text{internal}}(\Gamma, C) \exp[\sum_{k=1}^{\infty} \Delta E / k_{\text{B}}T]$$

where $\sum_{i=1}^{n-1} \Delta E$ collects the energy changes of bonds whose energy *decreases* when $\Gamma \rightarrow \Gamma'$. Taking the ratio leads to

$$\frac{T(\Gamma',\Gamma)}{T(\Gamma,\Gamma')} = \exp[-(\sum^{+}\Delta E + \sum^{-}\Delta E)/k_{B}T]$$
$$= \exp[-\{E(\Gamma') - E(\Gamma)\}/k_{B}T]$$

This is the condition of detailed balance.

The role of symmetry

Conditions for the proof of detailed balance:

- Cluster 'flips' correspond with a global symmetry, e.g. permutation symmetry in the case of the Potts model. *H* must be invariant under this symmetry.
- the symmetry operation must be self-inverse.

Another (implicit) condition is that there are only pair interactions. *Any model* satisfying these conditions can be simulated by a cluster Monte Carlo method.

3) The geometric cluster Monte Carlo method

Consider a self-inverse geometric symmetry operation interchanging lattice sites i and i', j and j', etc. These operations can be:

- translations over half the system size (in case of pbc),
- rotations over π ,
- mirror inversions,
- and combinations of these.

In many cases the Hamiltonian of a model satisfies such global symmetries, and a cluster Monte Carlo algorithm can be formulated. See:

continuous space:	Dress & Krauth,
	J. Phys. A 28 L597 (1995)
lattice models:	Heringa & Blöte,
	Physica A 232 369 (1996)
2 lattice models:	Redner et al.,
	Phys. Rev. E 58 2749 (1998)

Cluster formation rule: bond pair is flippable if $\Delta E \leq 0$; if $\Delta E > 0$, flippable with probability $e^{-\Delta E/k_BT}$. Examples:

- Ising and Potts models at nonzero magnetization
- lattice gases with nearest-neighbor exclusion
- critical and tricritical Blume-Capel model (spin-1 Ising model)
- Potts models with vacancies
- Baxter's hard-square and hard-hexagon lattice gases

Example of cluster formation:



Formation of geometric cluster in hard-square LG

Critical slowing down? Yes, if only clusters

- of size of order 1
- of size of order L

Optimal efficiency if cluster formation occurs on percolation threshold Proof for 2-D ferro Ising model:



One system (R) has AF seam (red lines). Fold lattices: $\rightarrow ++, +-, -+, \text{ and } --$ pairs. Critical susceptibility of L^d system:

$$\chi(L) = N^{-1} \langle (N_{++} - N_{--})^2 \rangle \propto L^{2y_h - d}$$

for both systems L and R. Add indices:

$$\chi_{\mathsf{R}}(L) = N^{-1} \langle (N_{++} - N_{--})^2 \rangle_{\mathsf{R}} \\ = N^{-1} \langle (N_{+-} - N_{-+})^2 \rangle_{\mathsf{L}}$$

Form S-W style geometric clusters on L using mirror inversion (green line)

There are 2 sorts of clusters:

- 2-spin clusters: ++ or -- pairs;
- others: + spins in one sheet, spins in other.

Let there be n_c 'other' clusters. Since +- and -+ are equally probable, one has

$$N^{-1} \langle (N_{+-} - N_{-+})^2 \rangle = N^{-1} 2^{-n_c}$$
$$\langle \sum_{p_1 = \pm 1} \cdots \sum_{p_{n_c} = \pm 1} (\sum_k n_k p_k)^2 \rangle = N^{-1} \langle \sum_k n_k^2 \rangle$$

Since probability to select cluster k is n_k/N , this is the *average geometric cluster size* for the single-cluster method. Recall:



 \rightarrow percolation threshold.



Cluster size distribution for critical simple-cubic lattice gas with nn exclusion. System sizes are L^3 with L=8, 16 and 32.



Autocorrelation times τ of energy of tricritical 3D Blume-Capel model (Ising with vacancies) circles: single-spin updates squares: geometric clusters

Result $z \approx 0.21$ seems to violate Li-Sokal limit (Phys. Rev. Lett. **63**, 827 (1989)) which says $z \ge \alpha/\nu = 1$ ($\alpha = \nu = 1/2$) for tricritical 3D Ising model. Way out: calculate α under *constraint*: $\alpha = -1$.

4) Fisher Renormalization

Constraint: scaling properties modified. Example: Blume-Capel model (s = 1 Ising):

$$\mathcal{H} = -K \sum_{\langle ij \rangle} s_i s_j + D \sum_k s_k^2$$

with $s_l = \pm 1$ or 0. Grand canonical partition sum:

$$Z_{g} = \sum_{\{s_i\}} \exp(-\mathcal{H})$$

Canonical partition sum for N_v vacancies:

$$Z_{\mathsf{C}}(N_v) = \sum_{\{s_i\}} \delta_{\sum_k s_k^2, N - N_v} \exp(-\mathcal{H})$$

explores the constant vacancy density ensemble.

Theory for thermodynamic limit: M.E. Fisher, Phys. Rev. **176**, 257 (1968). If one knows

$F_{g}(K,D) = -kT \ln Z_{g}(K,D)$

one can calculate

$$F_{\mathsf{C}}(K,\rho) = -kT \ln Z_{\mathsf{C}}(K,\rho)$$

because system describes path D(K) determined by

$$\langle \sum_{k} s_{k}^{2} \rangle = -\frac{\partial \log Z(K, D)}{\partial D} = N - N_{v}$$

so that

$$\rho_{g} = 1 + \frac{\partial \log Z(K, D)}{\partial D}$$

 $\rho(K,D) \to D(K,\rho)$

Path of constrained system in (K, D) plane:





Substitute in F_g :

 $F_{g}(K,D) = F_{g}(K,D(K,\rho))$

Thermodynamic limit: OK Finite-size-scaling: mostly unexplored. Constrained specific heat (Fisher renormalized):

$$C(L) = C_{\infty} + aL^{d-2y_t} \quad \text{if} \quad d-2y_t < 0$$

For Ising case $d - 2y_t = 0$:

$$C(L) = C_{\infty} + a/\ln L + \cdots$$

However...



Constrained specific heat of critical Blume-Capel model vs. \underline{L}

Hard-hexagon model: $y_t = 6/5$. Fixed density: Fisher renormalization expected



Constrained specific heat of critical hard-hexagon model vs. \underline{L}

Amplitude ratio Q of dilute q = 3 Potts model with constrained vacancy density

$$Q\equiv \langle m^2\rangle^2/\langle m^4\rangle$$

behaves, according to scaling, as

 $Q = Q_{\infty} + aL^{y_i}, \quad y_i = -4/5$

However...



Critical amplitude ratio Q vs. L.

Explanation behavior Q; Assume renormalization in grand ensemble

 $f(t,h,u,L) = -kT \ln Z_{g}$

 $= f_a + L^{-d} f(L^{y_t}t, L^{y_h}h, L^{y_i}u, 1)$

exponents y_t etc. known in principle Scaling behavior of observables follows:

 $Q_{g} = Q_{\infty,g} + aL^{y_i}, \quad y_i = -4/5$

 Q_{c} behaves near criticality as:

$$Q_{\mathsf{C}} = Q'_{\infty,\mathsf{C}} + a' L^{y_1} + \sum_k a_k (\Delta \rho)^k L^{ky_\rho}$$

where y_1 unknown; $\Delta \rho =$ deviation w.r.t. critical density $y_{\rho} = d - y_t$ if $2y_t - d \ge 0$ $y_{\rho} = y_t$ if $2y_t - d < 0$. Grand canonical expectation value:

$$Q_{g}(\mu, T) = \frac{\sum_{N_{p}} \sum_{\{\sigma\}} \delta_{N_{p}, \sum_{k} \sigma_{k}} Q(\{\sigma\}) \exp[-\mathcal{H}]}{Z_{c}} \times \frac{Z_{c}}{Z_{g}} = \int d\rho Q_{c}(\rho, T) P(\mu, \rho)$$

insert expression for $Q_{\rm C}$ with $\langle (\Delta \rho) \rangle = 0$ at criticality and $\langle (\Delta \rho)^2 \rangle = r_0 L^{-d} + r_1 L^{2y_t - 2d}$ Leading order of $\Delta \rho$:

$$Q_{g} = Q_{\infty,g} + a'L^{y_1} + wL^{-|2y_t-d|} + \cdots$$

However, we already know

$$Q_{g} = Q_{\infty,g} + bL^{y_i} + \cdots$$

Since $y_i \neq -2|y_t - d|$ in general, one *must* have

$$y_1 = -|2y_t - d|$$

as indeed found numerically.

5) Conclusion

- Cluster simulation of new models
- Investigation of constrained systems
- Exploration 'new' physics
- Renormalization not OK in canonical ensemble