

MCMC methods for random spatial permutations

Frontiers in Nonlinear Waves

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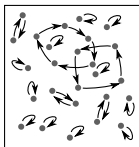
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The probability model

State space: $\Omega_{\Lambda, N} = \Lambda^N \times \mathcal{S}_N$, where $\Lambda = [0, L]^3$ with periodic boundary conditions.

Point positions: $\mathbf{X} = (\mathbf{x}_1, \dots, \mathbf{x}_N)$ for $\mathbf{x}_1, \dots, \mathbf{x}_N \in \Lambda$.



Hamiltonian, where $T = 1/\beta$ and $r_\ell(\pi)$ is the number of ℓ -cycles in π :

$$H(\mathbf{X}, \pi) = \frac{T}{4} \sum_{i=1}^N \|\mathbf{x}_i - \mathbf{x}_{\pi(i)}\|^2 + \sum_{\ell=1}^N \alpha_\ell r_\ell(\pi).$$

- The **first term** discourages long permutation jumps, more so for higher T .
- The **temperature** scale factor $T/4$, not $\beta/4$, is surprising but correct for the Bose-gas derivation of the Hamiltonian.
- The **second term** discourages cycles of length ℓ , more so for higher α_ℓ . These **interactions** are not between points, but rather between **permutation jumps**.

The probability model

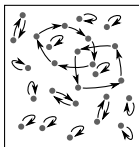
Fixed point positions (**quenched model** — includes all simulations done up to the present on the **cubic unit lattice** with $N = L^3$):

$$P_{\mathbf{X}}(\pi) = \frac{1}{Y(\Lambda, \mathbf{X})} e^{-H(\mathbf{X}, \pi)}, \quad Y(\Lambda, \mathbf{X}) = \sum_{\sigma \in \mathcal{S}_N} e^{-H(\mathbf{X}, \sigma)}.$$

Varying positions (**annealed model** — many theoretical results are available):

$$P(\pi) = \frac{1}{Z(\Lambda, N)} e^{-H(\mathbf{X}, \pi)}, \quad Z(\Lambda, N) = \frac{1}{N!} \int_{\Lambda^N} Y(\Lambda, \mathbf{X}) d\mathbf{X}.$$

In either case, we write the **expectation** of an RV $S(\pi)$ as $\mathbb{E}[S] = \sum_{\pi \in \mathcal{S}_N} P(\pi) S(\pi)$.



Feynman (1953) studied long cycles in the context of Bose-Einstein condensation for interacting systems. See also **Sütő (1993, 2002)**, and papers of **Betz and Ueltschi**.

The probability model: intuition

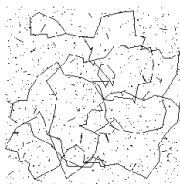
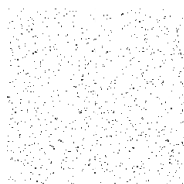
What does a typical random spatial permutation actually look like? (Recall

$$H(\mathbf{X}, \pi) = \frac{T}{4} \sum_{i=1}^N \|\mathbf{x}_i - \mathbf{x}_{\pi(i)}\|^2 + \sum_{\ell=1}^N \alpha_{\ell} r_{\ell}(\pi).)$$

- As $T \rightarrow \infty$, the probability measure becomes supported only on the **identity permutation**. Large but finite T : there are tiny islands of 2-cycles, 3-cycles, etc.
- As $T \rightarrow 0$, length-dependent terms go to zero. The probability measure approaches the **uniform distribution** on \mathcal{S}_N : all π 's are equally likely.

For intermediate T , things get more interesting:

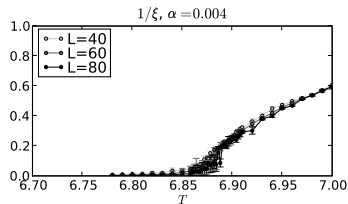
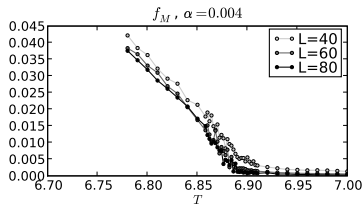
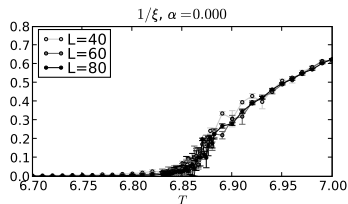
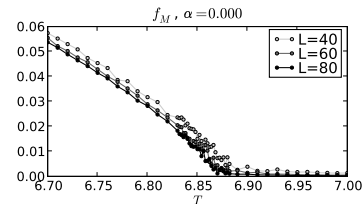
- The length of each permutation jump, $\|\pi(\mathbf{x}) - \mathbf{x}\|$, remains small.
- Above a **critical temperature** T_c , all cycles are short: 2-cycles, 3-cycles, etc. $T_c \approx 6.86$, and positive α terms increase T_c .
- **Phase transition** at T_c : below T_c , jump lengths remain short but *long cycles form*. Order-parameter RVs f_I, f_M, f_W, f_S quantify this; ξ is **correlation length**.
- Figures: high T , medium but subcritical T , and low T .



Behavior of order parameters as functions of L , T , and α .

$f_M = \mathbb{E}[\ell_{\max}]/N$ is left-sided; $1/\xi$ is right-sided. All order-parameter plots tend to the right as α increases, i.e. $\Delta T_c(\alpha) = \frac{T_c(\alpha) - T_c(0)}{T_c(0)}$ is positive for small positive α .

Goal: quantify $\Delta T_c(\alpha)$'s first-order dependence on α .



Known results and conjectures

Recall $H(\mathbf{X}, \pi) = \frac{T}{4} \sum_{i=1}^N \|\mathbf{x}_i - \mathbf{x}_{\pi(i)}\|^2 + \sum_{\ell=1}^N \alpha_\ell r_\ell(\pi)$. We have the following models:

- **Non-interacting model:** $\alpha_\ell \equiv 0$.
- **Two-cycle model:** $\alpha_2 = \alpha$ and other cycle weights are zero.
- **Ewens model:** α_ℓ is constant in ℓ .
- **General-cycle model:** No restrictions on α_ℓ .

Known results for the continuum (obtained largely using Fourier methods):

- $\Delta T_c(\alpha)$ is known (to **first order in α**) for two-cycle interactions (Betz and Ueltschi, CMP 2008) and **small cycle weights** (Betz and Ueltschi 2008). (This taps into a long and controversial history in the physics literature: see Baym et al., EJP B 2001, or Seiringer and Ueltschi, PRB 2009, for surveys.) The critical (ρ, T, α) manifold relates ρ_c to T_c .

$$\rho_c(\alpha) \approx \sum_{\ell \geq 1} e^{-\alpha_\ell} \int_{\mathbb{R}^3} e^{-\ell 4\pi^2 \beta \|\mathbf{k}\|^2} d\mathbf{k} = \frac{1}{(4\pi\beta)^{3/2}} \sum_{\ell \geq 1} e^{-\alpha_\ell} \ell^{-3/2}$$

$$\Delta T_c(\alpha) \approx c \rho^{1/3} \alpha, \quad \text{for } \alpha \approx 0, \text{ with } c = 4\pi \zeta(3/2)^{-2/3} e^{2\alpha/3} \approx 0.66 \text{ when } \rho = 1.$$

Metropolis sampling

The **expectation** of a random variable S (e.g. f_W, f_M, f_I, f_S, ξ) is

$$\mathbb{E}[S] = \sum_{\pi \in \mathcal{S}_N} P(\pi) S(\pi).$$

The number of permutations, $N!$, grows intractably in N . The expectation is instead **estimated** by summing over some number M (10^4 to 10^6) typical permutations. The sample mean is now a random variable with its own variance.

The usual technical issues of Markov chain Monte Carlo (MCMC) methods are known and handled in my simulations and dissertation: **thermalization** time, proofs of **detailed balance**, **autocorrelation**, **batched means**, and **quantification of variance** of sample means.

Metropolis step (analogue of single spin-flips for the Ising model): swap permutation arrows which end at nearest-neighbor lattice sites. This either splits a common cycle, or merges disjoint cycles:



As usual, the **proposed** change is **accepted** with probability $\min\{1, e^{-\Delta H}\}$.

Computational results: ΔT_c

Raw MCMC data yield $S(L, T, \alpha)$ plots as above, for each order parameter S .

Finite-size scaling (see Caracciolo et al., arXiv:cond-mat/0312175 for a survey) determines the critical temperature $T_c(\alpha)$.

Define **reduced temperature** $t = \frac{T - T_c(\alpha)}{T_c(\alpha)}$, and **correlation length** ξ as above.

Hypotheses: (1) At infinite volume, $S \sim | -t |^\rho$ and $\xi \sim |t|^{-\nu}$ (power-law behavior).
(2) Finite-volume corrections enter only through a **universal function** Q_S of the ratio L/ξ :

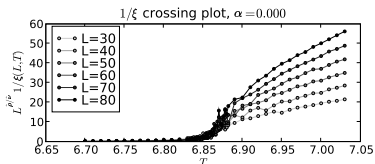
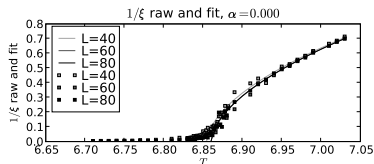
$$S(L, T, \alpha) = L^{-\rho/\nu} Q_S((L/\xi)^{1/\nu}) = L^{-\rho/\nu} Q_S(L^{1/\nu} t)$$

Method:

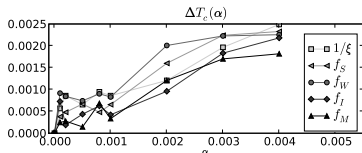
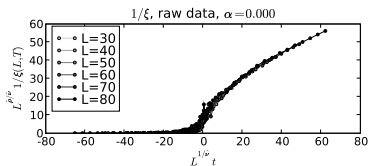
- Estimate **critical exponents** ρ, ν via power-law regression on MCMC data plots.
- Plot $L^{\hat{\rho}/\hat{\nu}} S(L, T, \alpha)$ as function of T . Since $t = 0$ at $T_c(\alpha)$, these plots for different L **cross** at $T_c(\alpha)$.
- Having estimated $\hat{\rho}$, $\hat{\nu}$, and $\hat{T}_c(\alpha)$, plot $L^{\hat{\rho}/\hat{\nu}} S(L, T, \alpha)$ as function of $L^{1/\hat{\nu}} \hat{t}$. This causes all curves to **collapse**, confirming the FSS hypothesis.
- Regress $\Delta \hat{T}_c(\alpha)$ on α to **estimate the constant** c .

Computational results: ΔT_c

Raw data vs. power-law fit for $1/\xi$ with $\alpha = 0$, followed by crossing plot:



Collapse plot for $1/\xi$ with $\alpha = 0$, followed by $\Delta T_c(\alpha)$ vs. α :



We find $T_c(0) \approx 6.683 \pm 0.003$ and $c \approx 0.665 \pm 0.067$ for Ewens weights on the lattice. For small cycle weights on the continuum, Betz and Ueltschi have $T_c(0) \approx 6.625$ and $c \approx 0.667$. Conclusions: (1) Lattice structure modifies the critical temperature; (2) the α -dependent shift in critical temperature is unaffected.

Other work

Dissertation items not presented today:

- Precise exposition of the theory of **autocorrelation estimators** for exponentially correlated Markov processes. Precise quantification of the advantages and non-advantages of batched means.
- A **worm algorithm** permits **odd winding numbers** and has an elegant theory. However, it has a stopping-time problem.
- **Finite-size scaling** details.
- Mean length of longest cycle as a fraction of the number of sites in long cycles recovers work of **Shepp and Lloyd** (1966) for non-spatial uniform permutations.

For the future (postdoctoral):

- Use **varying (annealed) point positions** on the continuum. This samples from the true point distribution.
- Replace cycle-weight interactions in the Hamiltonian with those derived from the **true Bose-gas model**. Analytical as well as simulational work is needed in order to make this computationally tractable.

For more information, please visit <http://math.arizona.edu/~kerl>.

Thank you for attending!