

Loop-Cluster Coupling and Algorithm for Classical Statistical Models

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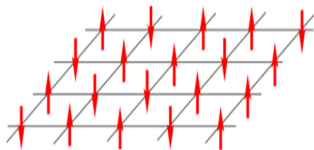
March 18, 2022

Reference

- ▶ **Lei Zhang**, Manon Michel, Eren M. Elçi and Youjin Deng, Phys. Rev. Lett. **125**, 200603 (2020).

Representations of the Potts model

spin representation



- ▶ Defined on $G = (V, E)$
- ▶ Hamiltonian

$$H_{\text{spin}} = - \sum_{(ij) \in E} J_{ij} \delta_{\sigma_i \sigma_j}$$

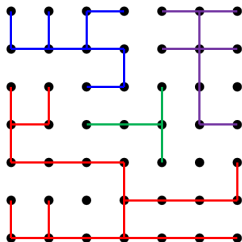
- ▶ $\sigma_i \in \{0, 1, \dots, q-1\}, i \in V$

- ▶ Counting measure ($p_{ij} = 1 - \exp(-J_{ij})$)

$$\begin{aligned} d\mu_{\text{spin}}(\{\sigma\}) &= \mathcal{Z}_{\text{spin}}^{-1} \prod_{(ij)} \exp [J_{ij}(\delta_{\sigma_i, \sigma_j} - 1)] d\mu_0(\{\sigma\}) \\ &= \mathcal{Z}_{\text{spin}}^{-1} \prod_{(ij)} [p_{ij} \delta_{\sigma_i, \sigma_j} + (1 - p_{ij})] d\mu_0(\{\sigma\}) \end{aligned}$$

Representations of the Potts model

Fortuin-Kasteleyn (FK) representation



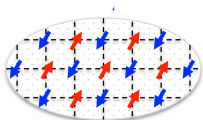
- ▶ Bond variable $b \in \{0, 1\}$ on each edge (ij)
 - ▶ $b = 1$: (ij) is occupied
 - ▶ $b = 0$: (ij) is unoccupied
- ▶ Configuration space: all possible $\{b\}$
- ▶ $G_b = (V, E_b)$ E_b : set of occupied edges

- ▶ Counting measure $(p_{ij} = 1 - \exp(-J_{ij}))$

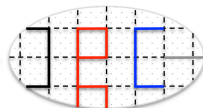
$$d\mu_{\text{FK}}(\{b\}) = \mathcal{Z}_{\text{FK}}^{-1} q^{k(G_b)} \prod_{(ij) \in E_b} p_{ij} \prod_{(ij) \notin E_b} (1 - p_{ij}) d\mu_0(\{b\})$$

- ▶ $k(G_b)$: number of clusters in G_b
- ▶ $q > 0$ is real

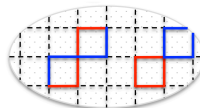
Algorithms for Potts model



Spin: Metropolis



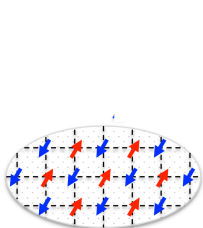
FK: Sweeny



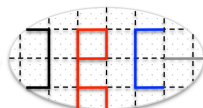
q -Flow: Worm

- ▶ Spin: Metropolis Alg. [J. Chem. Phys. 21, 1087 (1953)]
- ▶ FK: Sweeny Alg. [Phys. Rev. B 27, 4445 (1983)]
- ▶ q -flow: Worm Alg. [Phys. Rev. Lett. 87, 160601 (2001)]

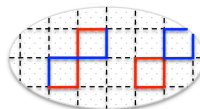
Algorithms for Potts model



Spin: Metropolis



FK: Sweeny

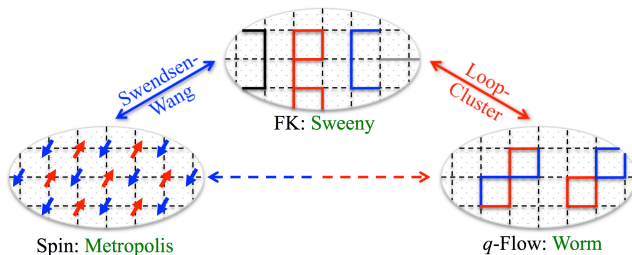


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Limit: simulations and measurements are constricted
in the same representation

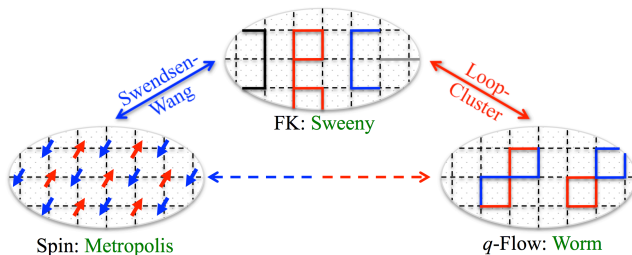
Algorithms for Potts model



- ▶ Spin & FK: Swendsen-Wang (SW) Alg. [PRL 58, 86 (1987)]
- ▶ q -flow & FK¹: Loop-Cluster (LC) Alg. [PRL: 125, 200603 (2020)]
- ▶ q -flow & Spin: Combination of SW Alg. and LC Alg.

¹Coupling for Ising model was first presented in Electron. J. Comb. 16, R46 (2009)

Algorithms for Potts model



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A single Markov-chain simulation can simultaneously sample physical quantities in any representation!

¹Coupling for Ising model was first presented in Electron. J. Comb. 16, R46 (2009)

How to couple different representations?

General idea [PRD 38,2009 (1988)]: define a joint model $d\mu(\{f\}, \{b\})$ so that

- ▶ Marginal measure of $\{f\}$ is precisely the q -flow measure
- ▶ Marginal measure of $\{b\}$ is precisely the FK measure

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General idea [PRD 38,2009 (1988)]: define a joint model $d\mu(\{f\}, \{b\})$ so that

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- ▶ Marginal measure of $\{b\}$ is precisely the FK measure

Then

- ▶ Given $\{f\}$, FK configurations are generated according to conditional measure $d\mu(\cdot | \{f\})$
- ▶ Given $\{b\}$, q -flow configurations are generated according to conditional measure $d\mu(\cdot | \{b\})$

Loop-Cluster Joint Model

► Definition

$$d\mu_{\text{jLC}}(\{f\}, \{b\}) = \mathcal{Z}_{\text{jLC}}^{-1} \delta_{\partial G = \emptyset} \prod_{(ij)} \left[\frac{p_{ij}}{q} \delta_{f_{ij} \neq 0} \delta_{b_{ij}, 1} + \frac{p_{ij}}{q} \delta_{f_{ij} = 0} \delta_{b_{ij}, 1} + (1 - p_{ij}) \delta_{f_{ij} = 0} \delta_{b_{ij}, 0} \right] d\mu_0(\{f\}) d\mu_0(\{b\})$$

► Given $\{f\}$, conditional measure $d\mu(\cdot | \{f\})$ is obtained as:

► independently for each (ij)

$$p(b_{ij} = 1 | f_{ij} > 0) = 1; p(b_{ij} = 1 | f_{ij} = 0) = \frac{p_{ij}}{p_{ij} + q(1 - p_{ij})} = t_{ij}$$

► Given $\{b\}$, conditional measure $d\mu(\cdot | \{b\})$ is obtained as:

► for subset of flow variables $\{f\}_{\text{b}}$ on G_{b}

$$p(\{f\}_{\text{b}} | G_{\text{b}}) = q^{-c(G_{\text{b}})} \delta_{\partial G_{\text{b}} = \emptyset}$$

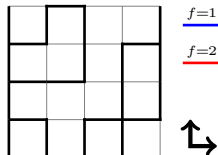
► for subset of flow variables on $(ij) \notin E_{\text{b}}$

$$p(f_{ij} = 0 | b_{ij} = 0) = 1$$

Loop-Cluster Algorithm

► From q -flow to FK

- For each $f_{ij} \neq 0$, set $b_{ij} = 1$
- For each $f_{ij} = 0$, set $b_{ij} = 1$ and 0 with t_{ij} and $1 - t_{ij}$, respectively



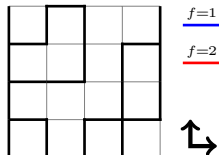
► From FK to q -flow

- For each $b_{ij} = 0$, set $f_{ij} = 0$
- For each cluster
 - (i) Search: construct a spanning tree from a root vertex; uniformly assign a flow value $f \in \{0, 1, \dots, q - 1\}$ to each missing edge
 - (ii) Backtrack: backtrack the tree and calculate the flow variables for all its edges by applying the conservation law to each vertex

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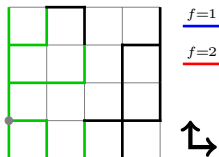
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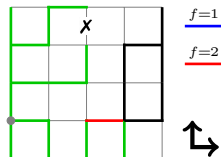
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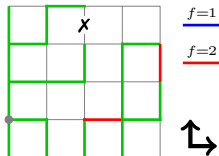
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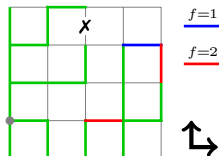


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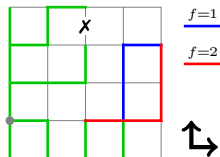


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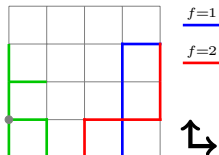
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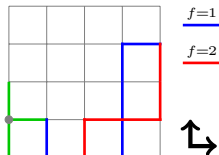
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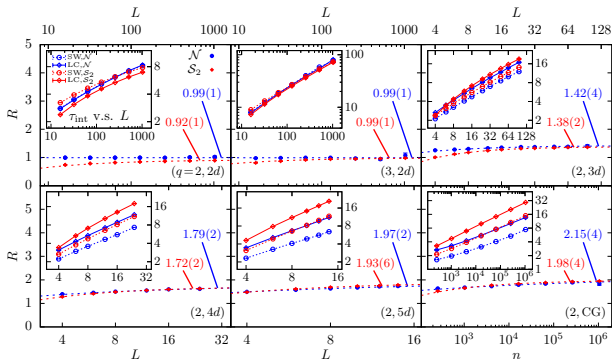
Extension

- ▶ Real $q \geq 1$ version for FK representation
 - ▶ Starting from $\{b\}$, choose an integer $1 \leq m \leq q$
 - ▶ Activate each cluster with probability m/q
 - ▶ Update active partition with LC algorithm for $q' = m$
- ▶ Single-cluster version for q -flow representation
 - ▶ Begin with $\{f\}$
 - ▶ Grow a cluster by Loop-to-Cluster process until it can not become larger
 - ▶ Update this cluster by Cluster-to-Loop process

Monte Carlo simulations

Efficiency

Comparison of LC & SW



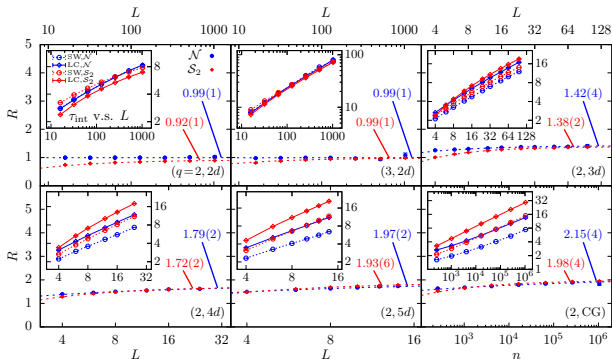
- \mathcal{N} : # of occupied bonds
- S_2 : second moment of FK cluster sizes
- $R = \tau_{\text{int}}^{(\text{LC})} / \tau_{\text{int}}^{(\text{SW})}$, τ_{int} : integrated autocorrelation time



Monte Carlo simulations

Efficiency

- Comparison of LC & SW: in same dynamic universality class

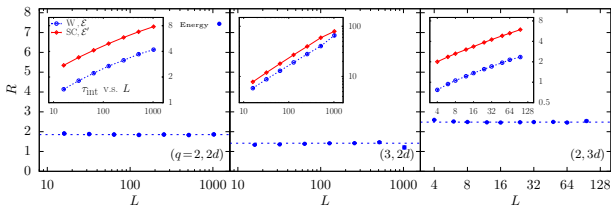


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Monte Carlo simulations

Efficiency

- Comparison of single-cluster version & Wolff Alg



- $\mathcal{E} = \sum_{(ij) \in E} \delta_{\sigma_i, \sigma_j}$, $\mathcal{E}' = \sum_{(ij) \in E} \delta_{f_{ij} \neq 0}$
- $R = \tau_{\text{int}, \mathcal{E}'}^{(\text{SC})} / \tau_{\text{int}, \mathcal{E}}^{(\text{W})}$

- Also in the same dynamic universality class

Monte Carlo simulations

New family of fractal objects

- ▶ For q -flow, backbone and FK clusters: $D_{qF} \leq D_{bb} \leq D_{FK}$
- ▶ Construct a hierarchy of q_F -flow clusters
 - ▶ For FK configuration with real q , do Cluster-to-Loop updates with q_F
 - ▶ For $q_F = 2$, the results are
 - ▶ $D_{qF} = 1.3333(2) \approx 4/3$ for $q = 1$
 - ▶ $D_{qF} = 1.3754(12) \approx 11/8$ for $q = 2$
 - ▶ $D_{qF} = 1.417(2) \approx 17/12$ for $q = 3$
 - ▶ $D_{qF} = 1.464(6) \approx 35/24$ for $q = 2 + \sqrt{3}$
 - ▶ All are consistent with $D_{EP} = 1 + g/8$
 - ▶ We conjecture $D_{qF}(q_F = 2) = D_{EP}$

Summary

- ▶ We present the Loop-Cluster joint model to couple the FK and q -flow representations of the Potts model
- ▶ Loop-Cluster algorithm is proposed, lifting the limitation of performing both simulations and measurements in a given representation
- ▶ LC algorithm and its single-cluster version belong to the same dynamic class as the SW and the Wolff algorithm, respectively
- ▶ LC coupling sheds much new light on the geometric properties of FK and q -flow clusters

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Thanks!