Phase Transition for the mixing time of Glauber Dynamics on Regular Trees at Reconstruction: Colorings and Independent Sets.

## Juan Vera Tilburg University, Netherlands

JOINT WORK WITH

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Phase Transition at Reconstruction

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# Coloring graphs

Given

- A graph G = (V, E) on *n* vertices and maximum degree  $\Delta$
- A set of k colors

A *k*-coloring of *G* is an assignment  $f: V \rightarrow \{1, ..., k\}$  such that

for all  $(u, v) \in E$ ,  $f(u) \neq f(v)$ 

## Given a graph with maximum degree $\Delta$

- How to construct k-colorings
  - Trivial for  $k > \Delta$
- How to sample (uniformly at) random k-colorings
  - Non-trivial even for  $k > \Delta$

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# Random Coloring graphs

## Why are we interested?

- How to sample (uniformly at) random *k*-colorings?
- How do random *k*-colorings look?
- Random colorings is the Gibbs distribution for (zero-temperature) anti-ferromagnetic Potts model.
- Efficient sampler yields approximation algorithm for counting colorings, which is #P-complete.

Let  $\Omega$  denote the set of all proper *k*-colorings of *G*.

Glauber dynamics (heat bath version)

Given  $X_t \in \Omega$ ,

- Take  $v \in V$  uniformly at random (u.a.r.)
- Take c u.a.r. from available colors for v in  $X_t$ :

$$\mathcal{A}_{X_t} = \{ \boldsymbol{c} : \boldsymbol{c} \notin X_t(\boldsymbol{N}(\boldsymbol{v})) \}.$$

• Obtain  $X_{t+1} \in \Omega$  by recoloring v to color c.

A natural threshold:  $k \ge \Delta + 2$ 

For  $k \ge \Delta + 2$ :

- Glauber dynamics is always ergodic.
- The (unique) stationary distribution is uniform over Ω, independently of initial coloring.

 $t \to \infty$ : distribution of  $X_t \to$  uniform dist. on  $\Omega$ .

• Run chain long enough to get close to uniform state.

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## Theorem (Hayes and Sinclair 05)

 $T_{\rm mix} = \Omega(n \ln n)$  for general graphs.

#### Intuitively, time necessary to see all vertices.

## Conjecture (folklore)

In general graphs, for  $k \ge \Delta + 2$  the mixing time is optimal, i.e.,

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- $k > 2\Delta$ : [Jerrum '95]
- $k > 11 \Delta/6$ :  $(T_{
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- Girth and/or max degree assumptions: [Dyer-Frieze'01], [Molloy'02], [Hayes'03], [Hayes-Vigoda'03], [Frieze-Vera'04], [Dyer-Frieze-Hayes-Vigoda'04]
- Δ-regular trees, any fix boundary: k ≥ Δ + 3, [Martinelli-Sinclair-Weitz '04]
- Planar graphs,  $k \ge 100\Delta / \ln \Delta$ :  $T_{mix} = O^*(n^3)$ [Hayes-Vera-Vigoda '07]
- For  $\Delta$ -regular trees,  $k = C\Delta / \ln \Delta$ :  $T_{\text{mix}} = n^{\Theta(\min(1,1/C))}$

[Lucier-Molloy '08],[Goldberg-Jerrum-Karpinski '08]

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## Outline



## Introduction

- Motivation
- Glauber dynamics
- Mixing Time

2 Colorings on the complete  $\Delta$ -Tree

- Reconstruction
- Main Result

3 Relation between reconstruction and mixing time



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# Significance of $\Delta / \ln \Delta$ :

Consider the complete tree with branching factor  $\Delta$  and height *h*.

#### Recall

For  $k = \Delta + 1$  there are colorings that "freeze" the root

Colors of leaves determine color of root

But this is not true for "typical" colorings

#### Question

For which values of k does a random coloring of the leaves freeze the root?

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## Reconstruction

Generating a random coloring of the tree: Broadcasting model

- Choose a random color for the root, call it  $\sigma(r)$ .
- Por each vertex ν, given the color of its parent σ(p(ν)), choose a random different color.

## Reconstruction

*Reconstruction* holds if the leaves have a non-vanishing (as  $h \rightarrow \infty$ ) influence on the root in expectation.

$$\lim_{h\to\infty} \mathbb{E}_{\sigma_L}\left[\left|\mu(\tau(r)|\tau(L)=\sigma_L)-\frac{1}{k}\right|\right]>0.$$

Given (random) coloring of leaves can guess color of root

## **Reconstruction threshold**

### Threshold is at $pprox \Delta/\ln\Delta$ [Sly'08, Bhatnagar-Vera-Vigoda'08]

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### **Reconstruction threshold**

### Threshold is at $\approx \Delta / \ln \Delta$ [Sly'08, Bhatnagar-Vera-Vigoda'08]

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# Connections of reconstruction to the efficiency of local algorithms on trees and tree-like graphs

- $T_{\text{mix}} = O(n \ln n)$  on the complete tree implies non-reconstruction [Berger-Kenyon-Mossel-Peres '05]
- "Clustering of solution space" in reconstruction region for several constraint satisfaction problems, including colorings, on sparse random graphs [Achlioptas,Coja-Oghlan '08]

#### We prove:

Mixing time of the Glauber dynamics for random colorings of the complete tree undergoes a phase transition. Critical point appears to coincide with the reconstruction threshold.

#### Theorem

Let  $k = C\Delta / \ln \Delta$ . There exists  $\Delta_0$  such that, for all  $\Delta > \Delta_0$ , the Glauber dynamics on the complete  $\Delta$ -tree on n vertices satisfies:

## ● For C ≥ 1:

$$\Omega(n \ln n) \leq T_{\min} \leq O\left(n^{1+o_{\Delta}(n)} \ln^2 n\right)$$

**3** For 
$$C < 1$$
:  

$$\Omega\left(n^{1/C+o_{\Delta}(n)}\right) \leq T_{\text{mix}} \leq O\left(n^{1/C+o_{\Delta}(n)}\ln^2 n\right)$$

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Ideas on lower bound for reconstruction region (C < 1)

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Usually reconstruction is proven via a reconstruction algorithm

## **Reconstruction Algorithm**

Function  $A: \Omega_L \rightarrow \{0, 1\}$  (ideally efficiently computable)

- For any  $\sigma$ ,  $A(\sigma_L)$  and  $\sigma(r)$  are positively correlated.
- Assume: when coloring of *L* freezes the root, *A* gives correct answer

Given reconstruction algorithm A

$$S_{c} = \{ \sigma \in \Omega : A(\sigma_{L}) = c \}$$

•  $S_c \supseteq \{ \sigma \in \Omega : \sigma_L \text{ freezes } r \text{ to } c \}.$ 

## Intuitive key Idea:

Under reconstruction: If initial coloring in  $S_R$  it is "difficult" to get to coloring in  $S_B$ .

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#### Conductance

Let  $S \subseteq \Omega$  and  $\overline{S} = \Omega \setminus S$ . Define

$$\Phi_{S} = \frac{\sum_{\sigma \in S} \sum_{\eta \in \bar{S}} \pi(\sigma) P(\sigma, \eta)}{\pi(S) \pi(\bar{S})}$$

• Related to probability of escaping from S in one step

Theorem (Lawler-Sokal '88. Sinclair-Jerrum '89)For all  $S \subseteq \Omega$  $T_{mix} \geq \Omega(1/\Phi_S)$ 

#### Formalized Key idea

Show S<sub>c</sub> has small conductance

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• Related to probability of escaping from S in one step

Theorem (Lawler-Sokal '88. Sinclair-Jerrum '89)For all  $S \subseteq \Omega$  $T_{mix} \ge \Omega(1/\Phi_S)$ 

#### Formalized Key idea

Show  $S_c$  has small conductance

# Relation between reconstruction and conductance

#### Goal

Show  $S_c$  has small conductance

#### Theorem

Under reconstruction, for any reconstruction function A,

 $\Phi_{S_c} = O\left(\mathsf{E}_{\sigma}\left[\Psi_{A}(\sigma) | \sigma \in S_{c}\right]\right)$ 

where

$$\Psi_{\mathcal{A}}(\sigma) = \#\{v \in L : \exists d \in [k] \ \mathcal{A}(\sigma^{v,d}) \neq \mathcal{A}(\sigma)\}.$$

 Sensitivity of A at σ: For how many leaves, changing color of leaf will change outcome of A.

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### Goal

Show Sc has small conductance

Actually, let  $S = \bigcup_{c < k/2} S_c$ .

• [Goldberg, Jerrum, and Karpinski - 08] For 0 < C < 1/2

$$\Phi_{\mathcal{S}} = O(n^{-\frac{1}{6C}})$$

• We prove for C < 1

$$\Phi_{\mathcal{S}} = O^*(n^{-1/C})$$

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#### Theorem

Let  $k = C\Delta / \ln \Delta$ . There exists  $\Delta_0$  such that, for all  $\Delta > \Delta_0$ , the Glauber dynamics on the complete  $\Delta$ -tree on n vertices satisfies:

## ● For C ≥ 1:

$$\Omega(n \ln n) \leq T_{\min} \leq O\left(n^{1+o_{\Delta}(n)} \ln^2 n\right)$$

**2** For 
$$C < 1$$
:  

$$\Omega\left(n^{1/C-o_{\Delta}(n)}\right) \leq T_{\text{mix}} \leq O\left(n^{1/C+o_{\Delta}(n)}\ln^2 n\right)$$

Does a similar phenomenon hold for independent sets? No, more interesting phenomenon occurs.

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## Hard-core model

- Graph G = (V, E) with *n* vertices and maximum degree  $\Delta$ .
- Independent set is a subset S ⊂ V where for all (v, w) ∈ E, either v ∉ S and/or w ∉ S.
- Activity (or fugacity)  $\lambda > 0$ .
- Hard-core distribution (i.e., Gibbs measure):  $\mu(S) \sim \lambda^{|S|}$ .

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## Reconstruction threshold for the hard-core model

Consider the complete tree with branching factor  $\Delta$  and height *h*. Let  $\omega$  be the solution to  $\lambda = \omega(1 + \omega)^{\Delta}$ .

## Broadcasting model:

- Occupy the root with probability  $p = \omega/(1 + \omega)$  and leave it unoccupied with 1 p.
- For each vertex v, if the parent is unoccupied, occupy v with probability p.

**Reconstruction** is said to hold if the leaves have a non-vanishing (as  $h \rightarrow \infty$ ) influence on the root in expectation:

$$\lim_{h\to\infty} \mathbb{E}_{\sigma_L}\left[\left|\mu(\mathbf{r}\in\tau|\tau(L)=\sigma_L)-\frac{\omega}{1+\omega}\right|\right]>0.$$

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- Reconstruction threshold:  $\omega_r \approx \frac{\ln \Delta + \ln \ln \Delta}{\Delta}$ [Bhatnagar-Sly-Tetali '10],[Brightwell-Winkler '04]
- Rapid mixing for free boundary: For the complete tree on *n* vertices,  $T_{\text{mix}} = O(n \log n)$  for all  $\lambda$  [Martinelli-Sinclair-Weitz '04]

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# Results for hard-core model:

## Theorem

For the Glauber dynamics on the hard-core model with activity  $\lambda = \omega(1 + \omega)^{\Delta}$  on the complete  $\Delta$ -tree with n vertices:

- For all  $\omega \leq \ln \Delta / \Delta$ :  $\Omega(n) \leq T_{rel} \leq O^*(n)$ .
- **2** For all  $\delta > 0$  and  $\omega = (1 + \delta) \ln \Delta / \Delta$ :
  - For every boundary condition,

$$T_{\mathrm{rel}} \leq O^*(n^{1+\delta}).$$

2 Exists a sequence of boundary conditions with h  $ightarrow\infty$  such that,

$$T_{\mathrm{rel}} \geq \Omega^*(n^{1+\delta/2}).$$

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## **Current and Future Work**

- Similar analysis of other CSPs (spin systems).
  - e.g. k-SAT
- Analysis of more general graphs.
- Poisson tree closely related to sparse random graph G(n, d/n).
  - For constant  $d, k, k \ge poly(d), T_{mix}(Col) = poly(n)$  whp. [Mossel-Sly '08]
  - Open: Prove "rapid mixing" down to  $d/\ln d$  colors.
- Explore more general relation between reconstruction and "local algorithms"

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