

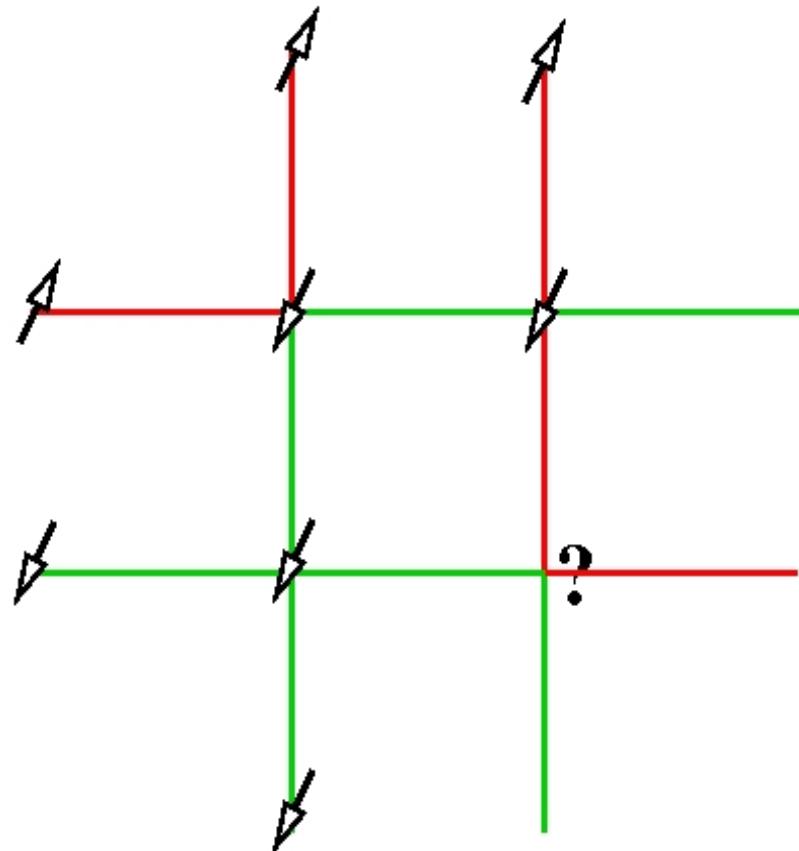
# 自旋玻璃体系模拟

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# 何谓自旋玻璃

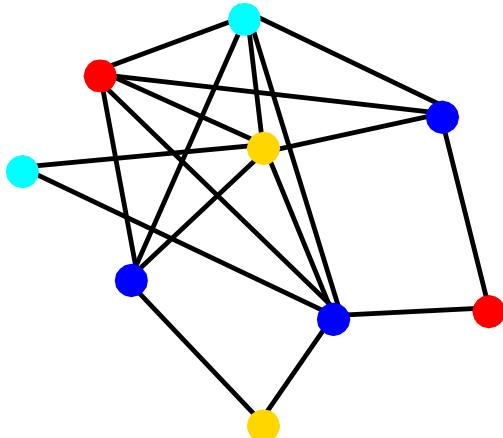
$$H = - \sum_{\langle ij \rangle} J_{ij} \sigma_i \sigma_j$$



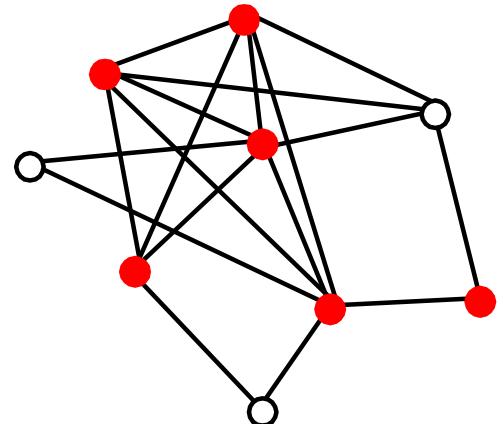
- 无序系统的简单模型
- 无序
- 竞争导致阻错
- 两体相互作用或多体相互作用

# 计算机科学中的对应问题：组合优化与约束满足

## Q-COLoring

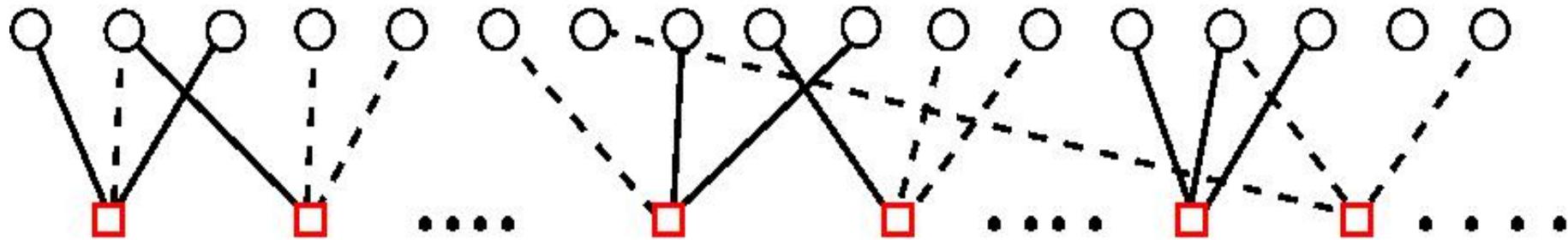


## Vertex Cover



Both are NP-complete problems,  
NP-complete problems can be very difficult

# K-SAT

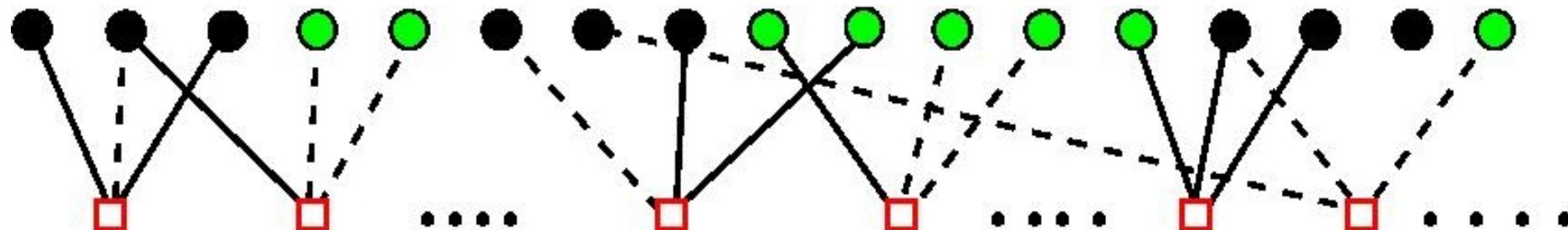


**N** binary variables:

**M** clauses:

constraint density  $\alpha = M/N$

a sat solution: black (true), green (false)



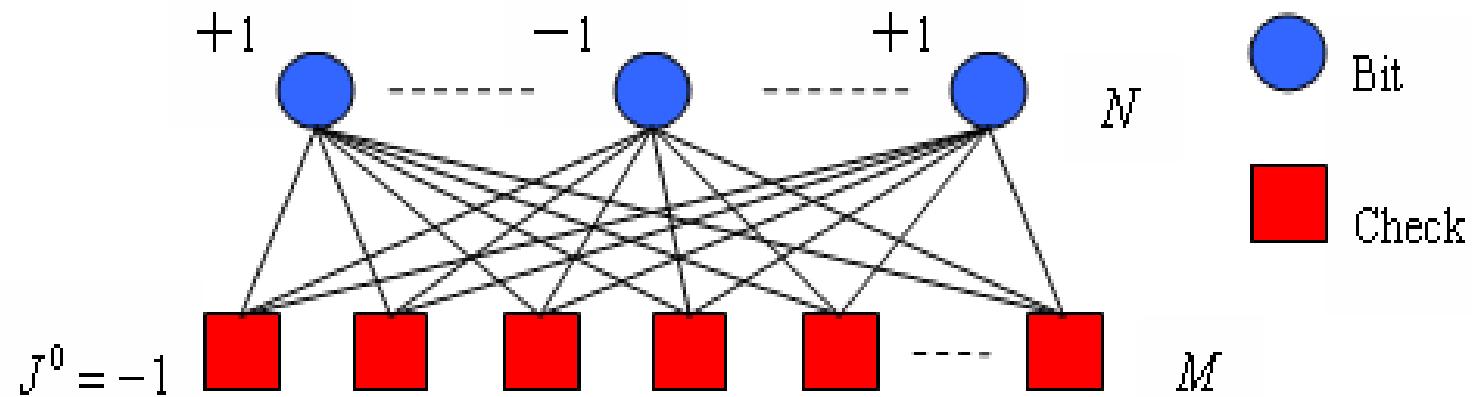
# 编码和解码： Low-density-parity-check codes



$$P(J^0 | \xi)$$

$$P(J | J^0)$$

$$P(\sigma | J)$$



# 自旋玻璃体系构象空间的相变

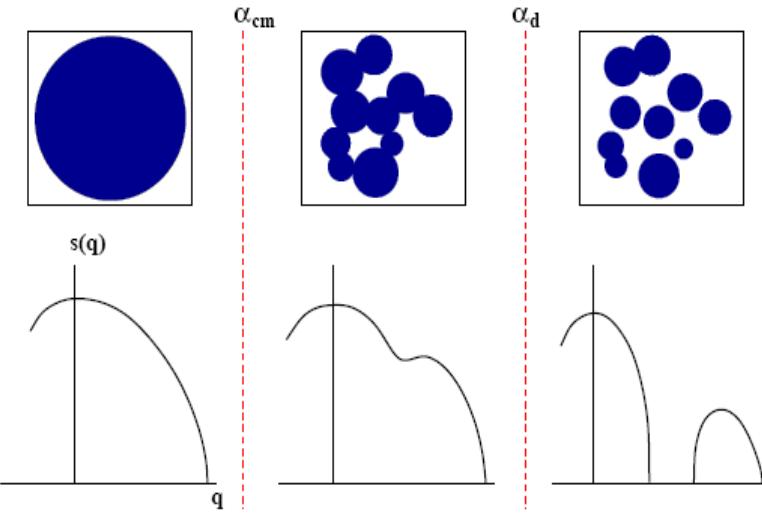


FIG. 1: (Color online) Evolution of the solution space  $S$  of a constrained spin system: At low constraint density  $\alpha$  (left panel),  $S$  is homogeneous and the solution-pair entropy density  $s(q)$  is a concave function of the overlap  $q$ . Solution communities start to form as  $\alpha$  exceeds a threshold value  $\alpha_{cm}$  (middle panel);  $S$  then becomes heterogeneous and the function  $s(q)$  changes to be non-concave. An ergodicity-breaking transition occurs as  $\alpha$  reaches a larger threshold value  $\alpha_d$  (right panel), where the solution communities separate into different solution clusters and there are no solution-pairs with intermediate overlap values.

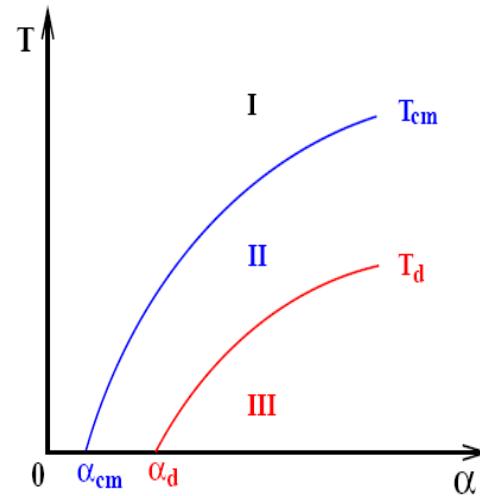
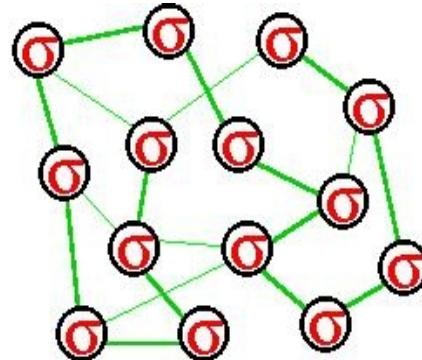
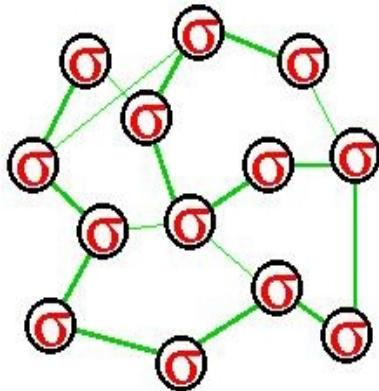


Fig. 4. Schematic phase diagram for a constraint satisfaction problem, using temperature  $T$  and constraint density  $\alpha$  as control parameters. The configuration space is homogeneous and ergodic in region I. As the temperature  $T$  decreases to  $T_{cm}(\alpha)$ , a homogeneity-breaking transition occurs, and the configuration space becomes non-homogeneous but still ergodic (region II). As  $T$  further decreases to  $T_d(\alpha)$ , an ergodicity-breaking (clustering) transition occurs, and the configuration space breaks into many separated clusters (region III). At  $T = 0$ , the ground-state configuration space is non-homogeneous at  $\alpha \geq \alpha_{cm}$  and non-ergodic at  $\alpha \geq \alpha_d$ .

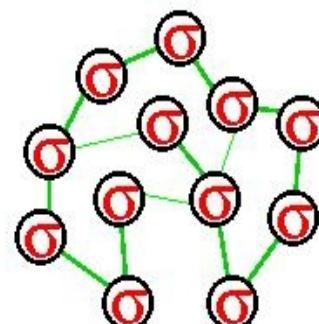
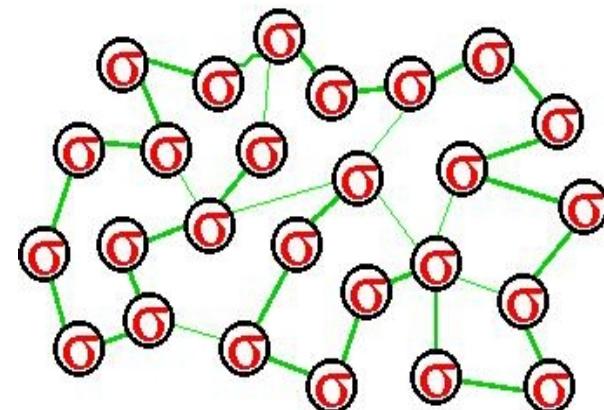
# understanding solution/configuration space complex structures



solution is N-dimension

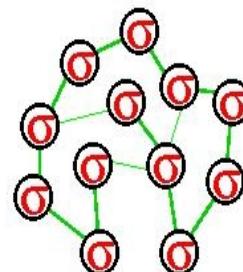
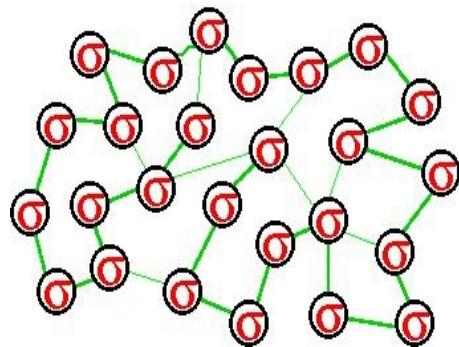
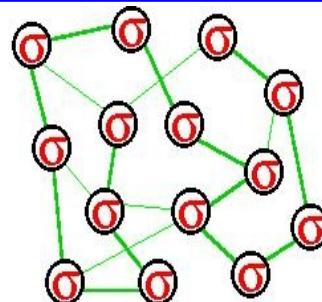
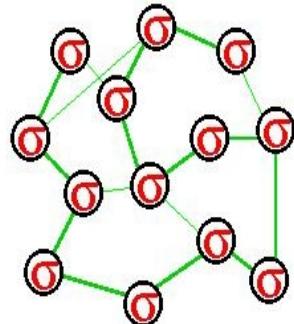
$$\sigma = \{0/1, 0/1, \dots, 0/1\}$$

two solutions are  
connected by an edge if  
their Hamming distance  
is **unity**



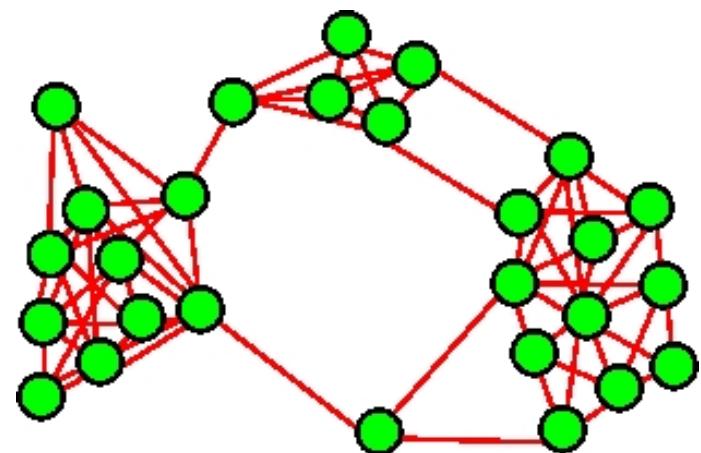
**solution clusters!**

# Our questions



I.-- Fine structure in a single solution cluster (**community structures**)

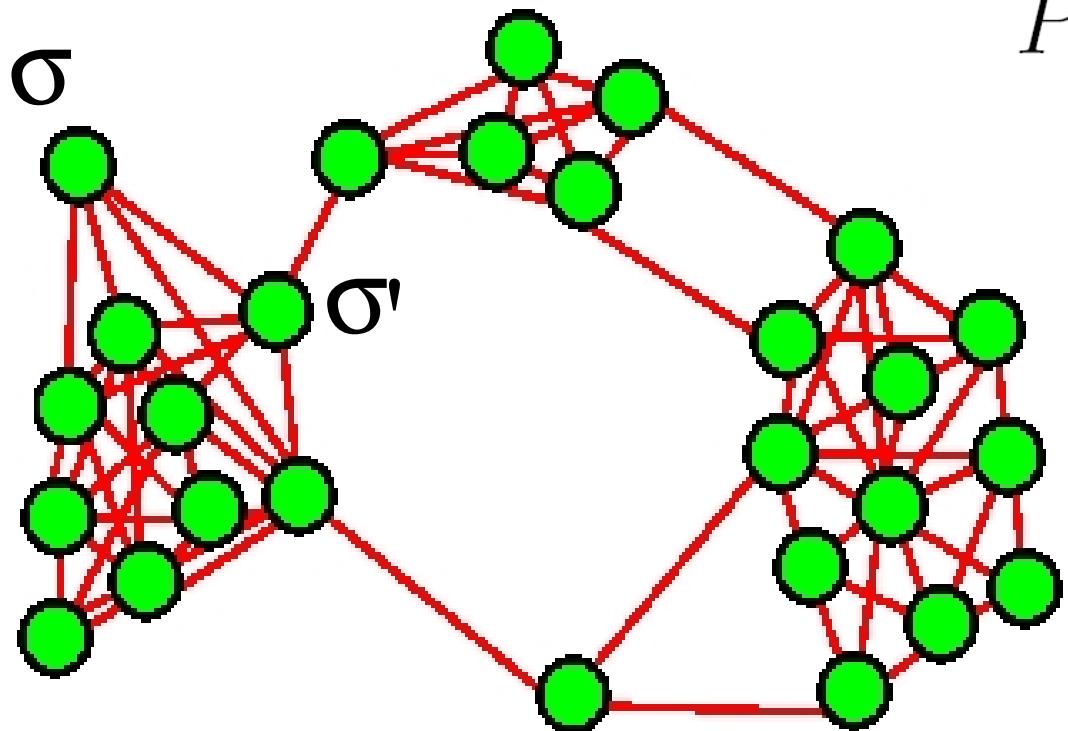
II.-- The influence of solution cluster fine structure to a stochastic search algorithm (**SEQSAT**)



**How to detect the structure of a single cluster?**

Enumeration is hopeless, as the graph is too large!

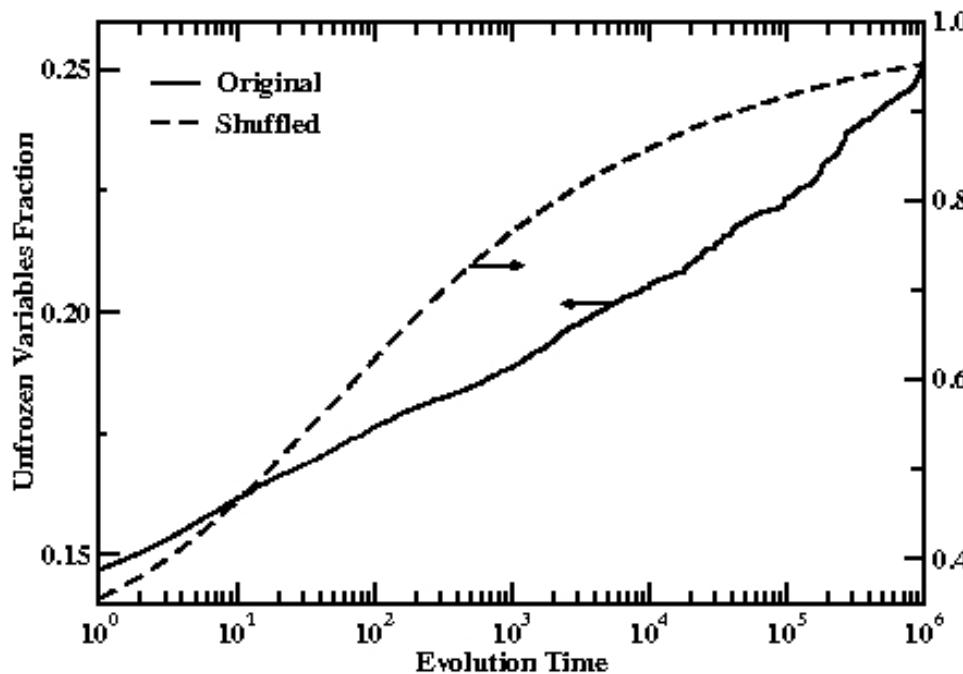
Our approach: **solution cluster random walking**



$$P(\sigma \rightarrow \sigma') = \frac{1}{|\partial\sigma|}$$

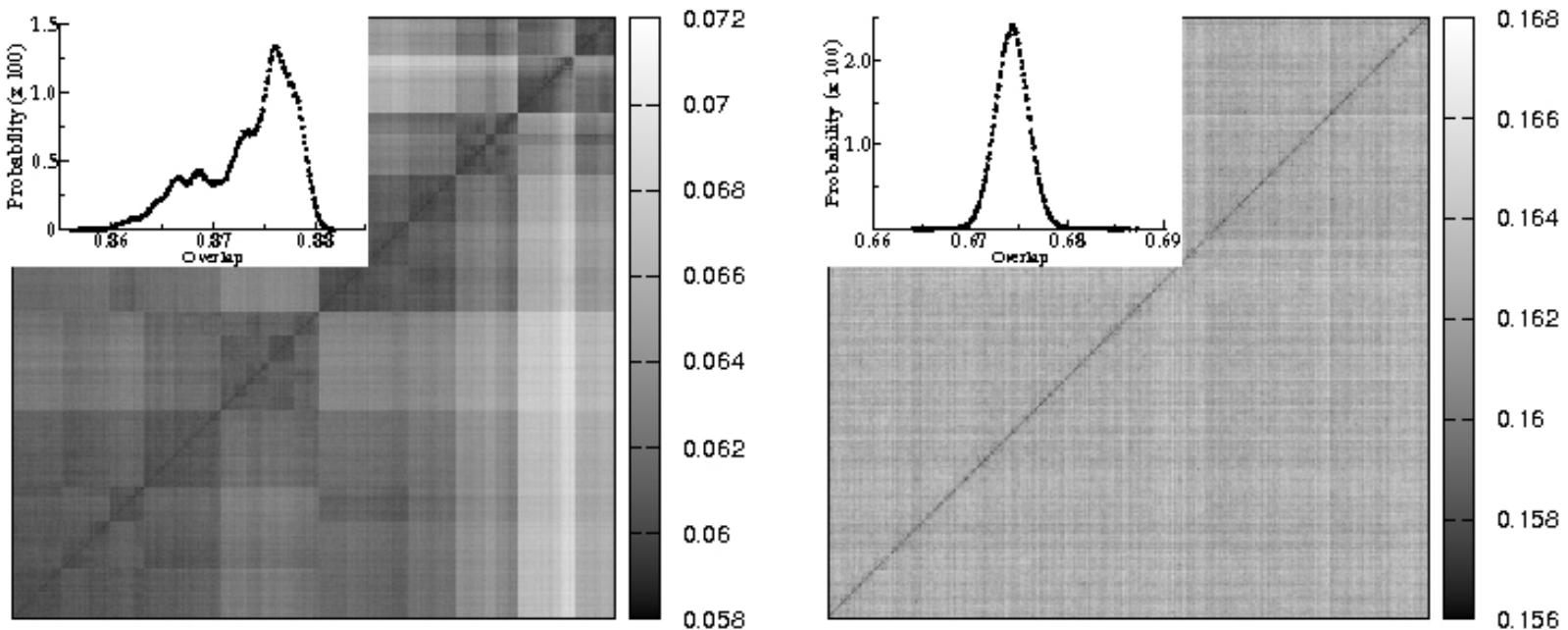
A

Original  
formula



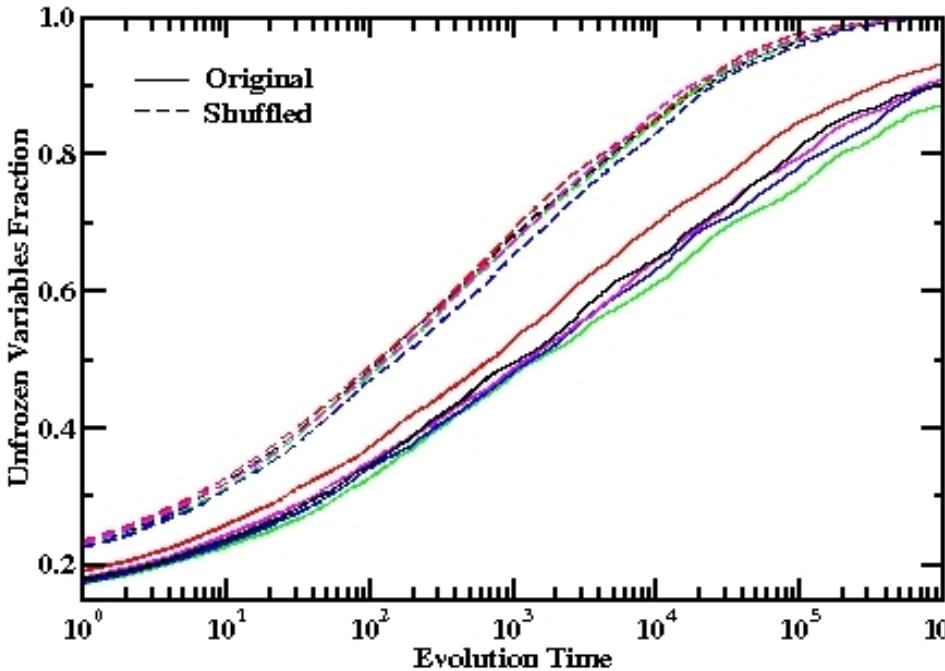
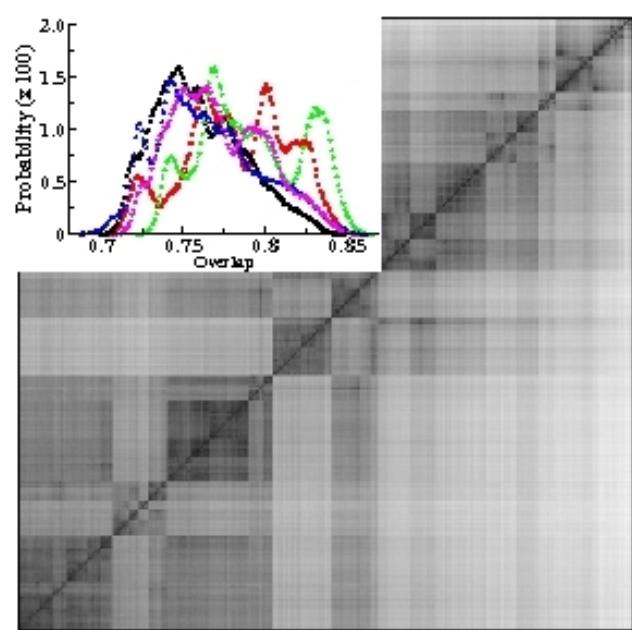
$K=3$   
 $N=1,000,000$   
 $M=4,200,000$   
 $\alpha=4.25$

A specially  
randomized  
version

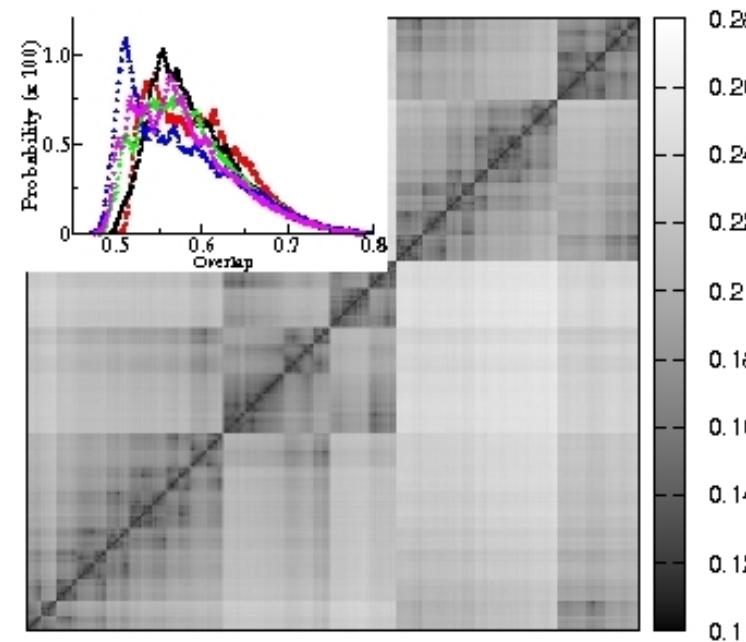


B

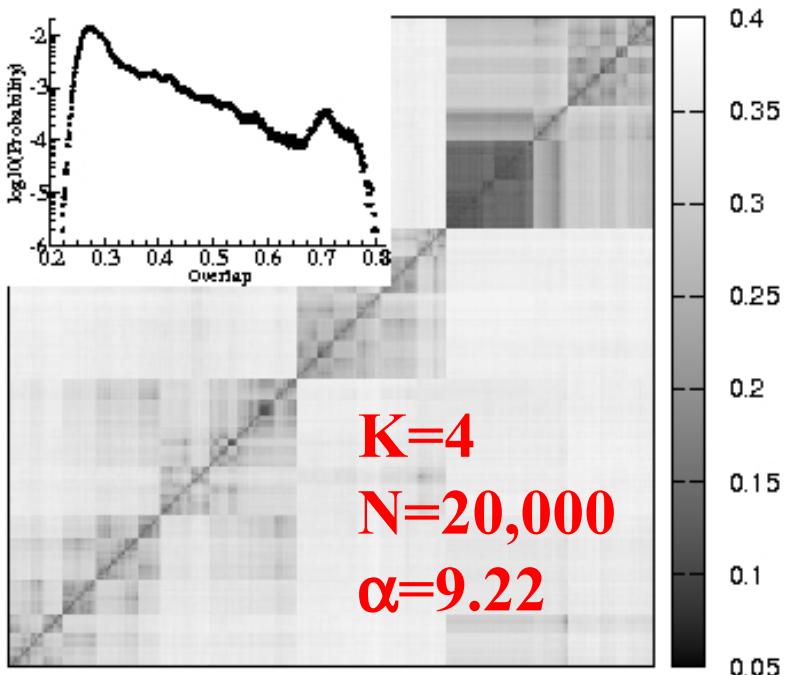
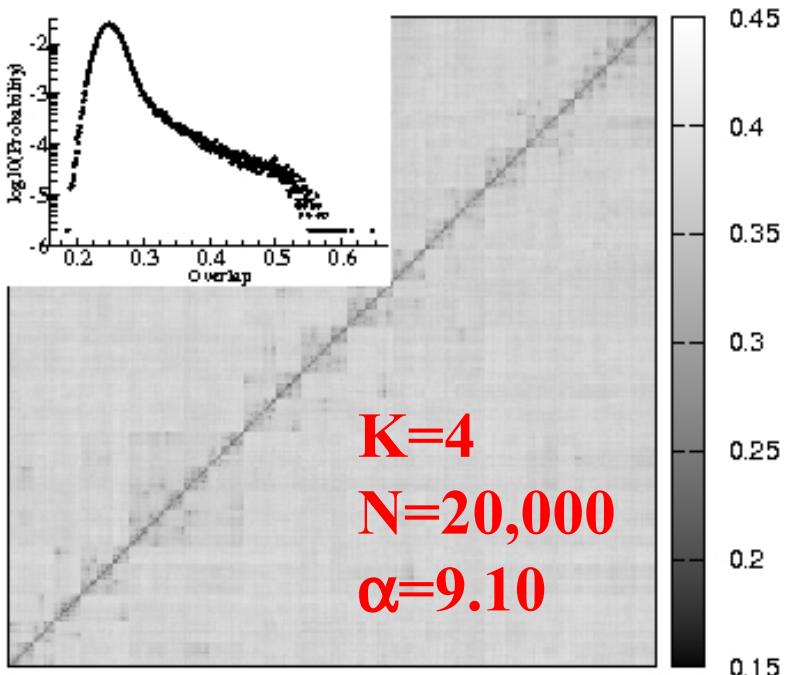
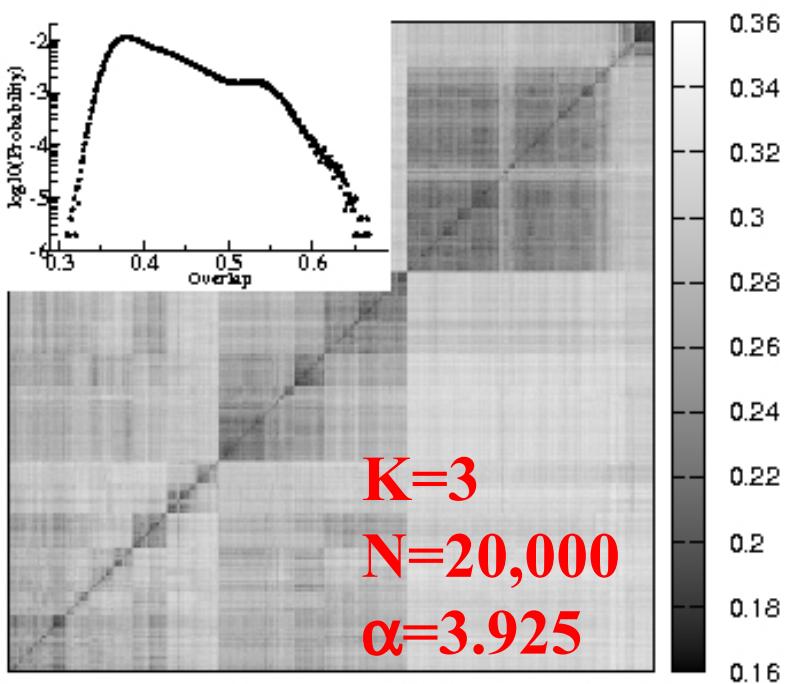
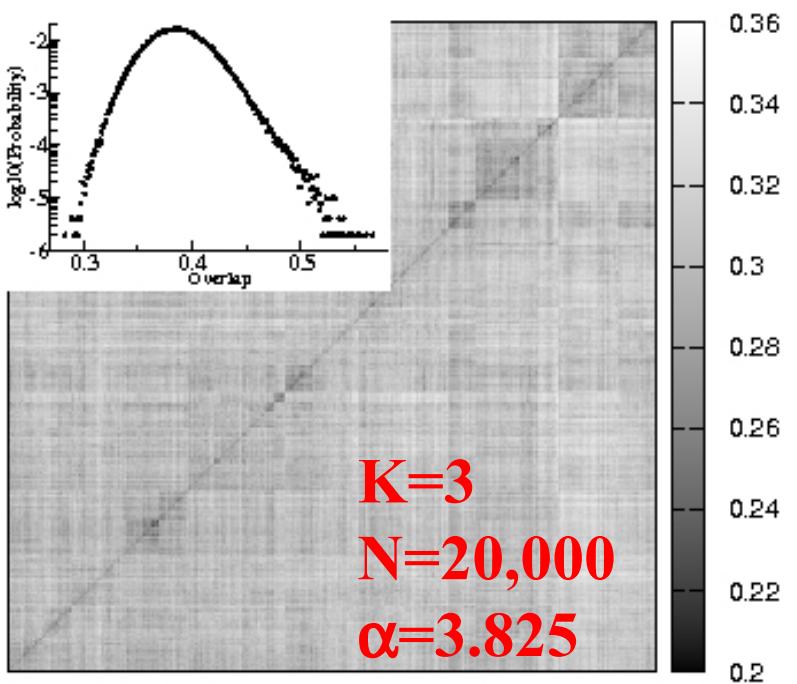
Original  
formula



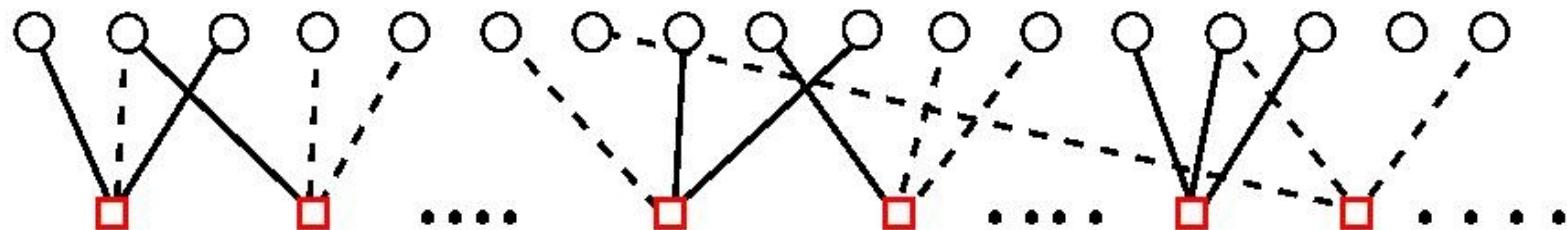
K=4  
N=100,000  
M=946,000  
alpha=9.46



A specially  
randomized  
version



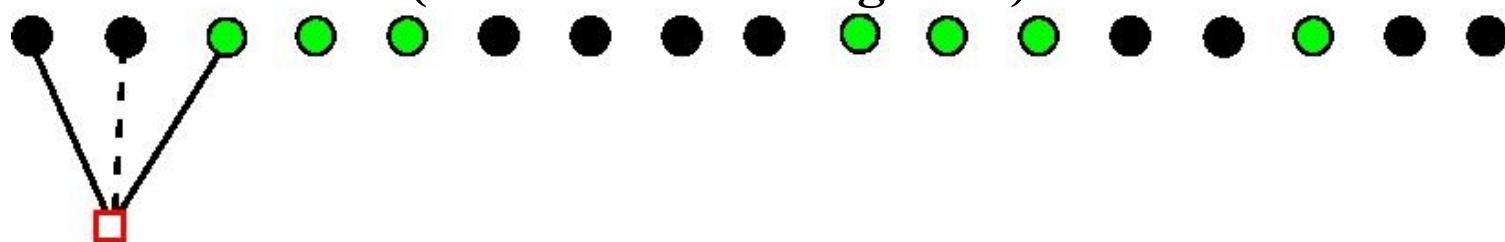
# Stochastic search SEQSAT within a solution cluster



Remove all clauses, randomly generate an initial configuration

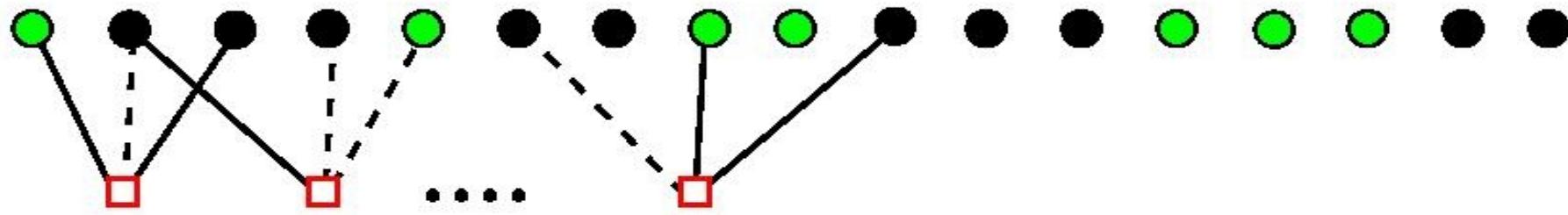


Random walking in the solution cluster until reach a configuration  
that sat the 1st clause (record the waiting time)

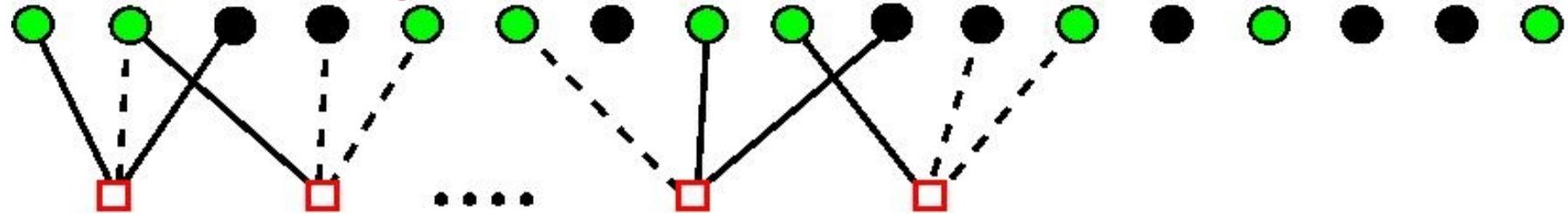


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a configuration that sat the first  $m$  clauses is reached at certain time



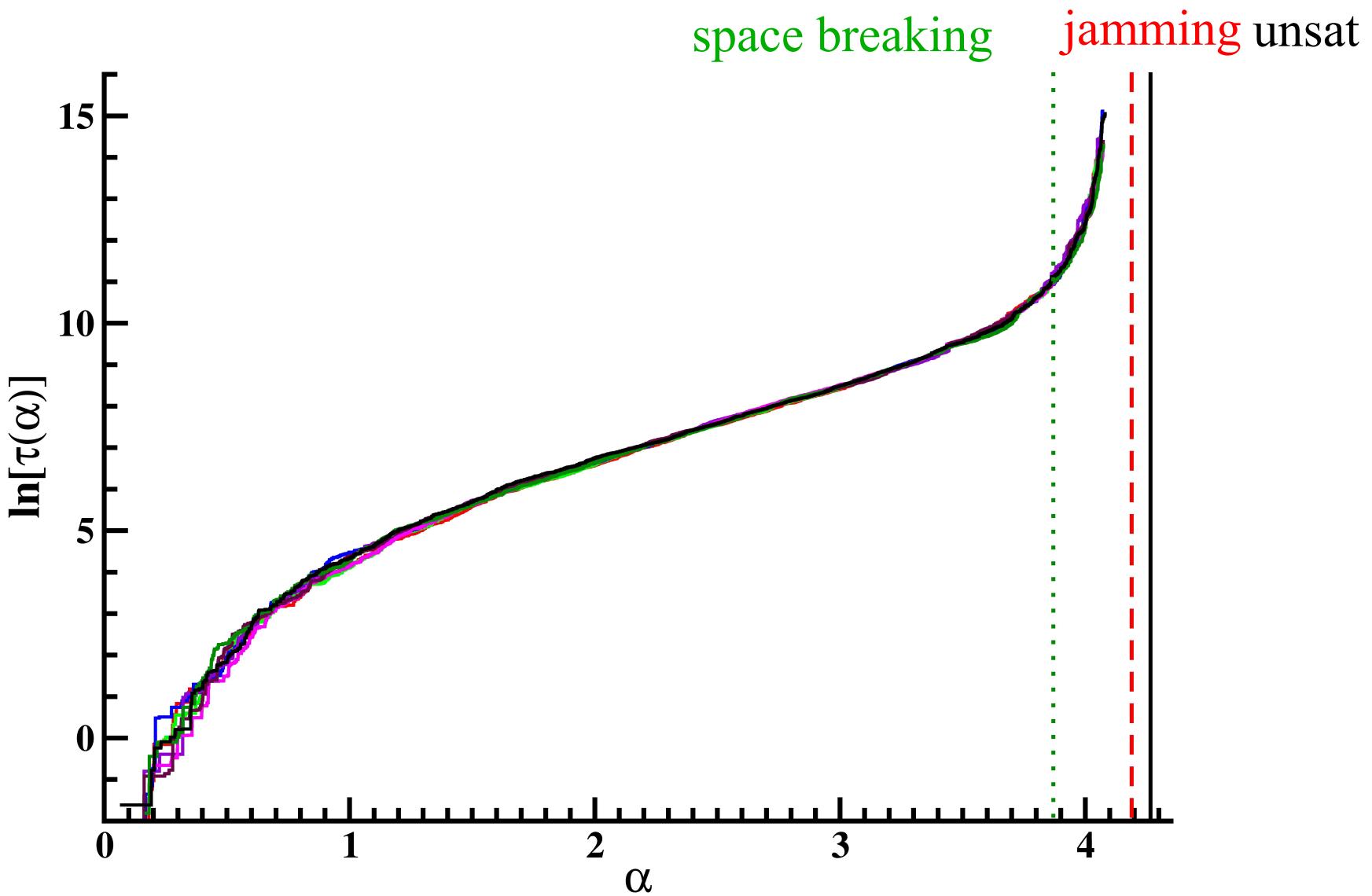
Random walking in the solution cluster of the satisfied subformula  
until reach a configuration that sat the  $(m+1)$ -th clause



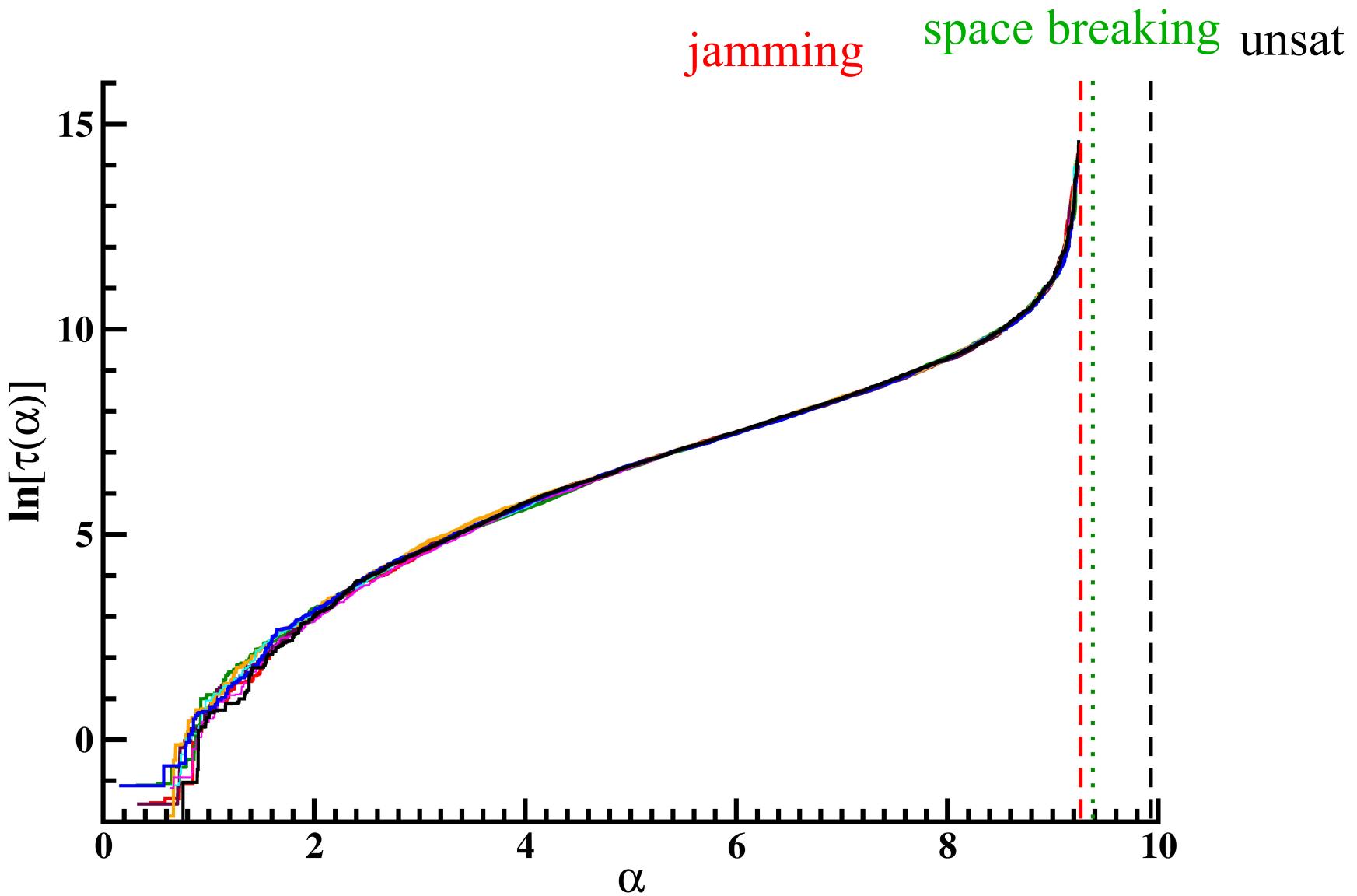
# properties of SEQSAT

- never crosses any energy barrier
- never jumps from one solution cluster to another different solution cluster
- just performs random walks within one solution cluster

# Performance of SEQSAT: K=3, N=100,000



# Performance of SEQSAT: K=4, N=100,000



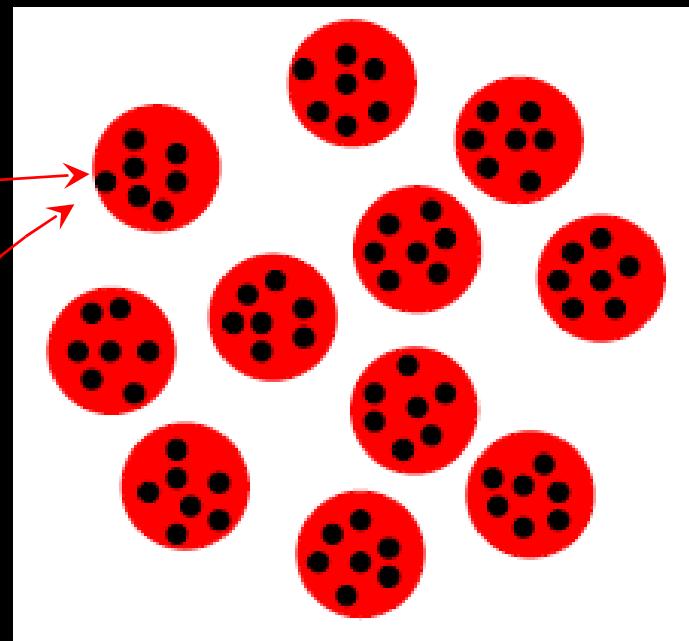
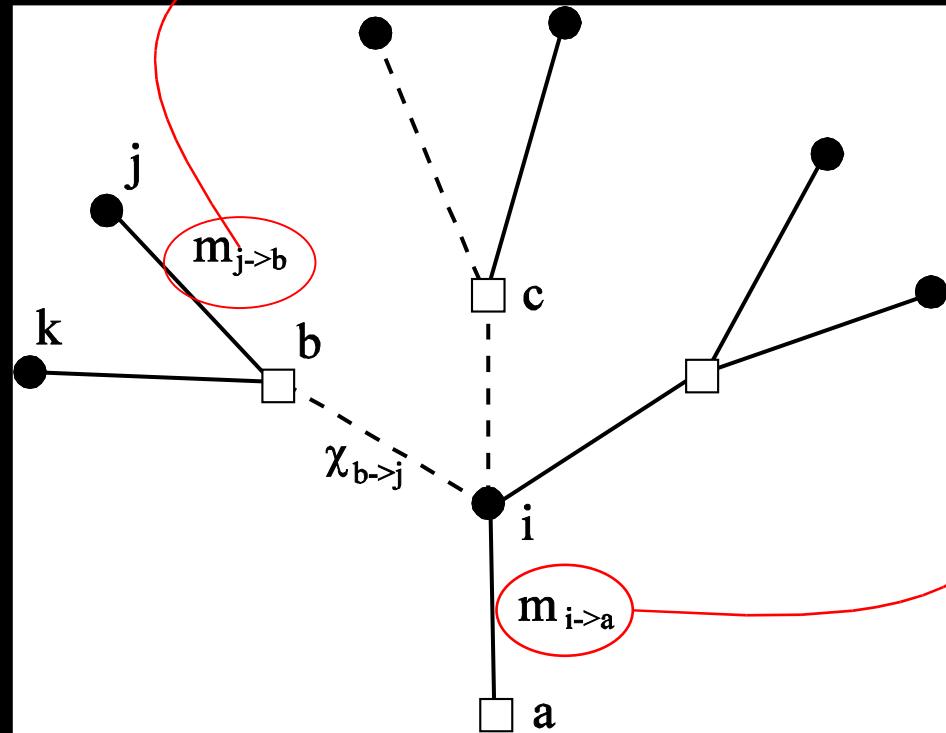
# 自旋玻璃低温性质的计算机模拟

- 无序样本
- 单个样本的 Monte Carlo 模拟
- 对多个样本的平均

$$\mathcal{H}(\sigma_1, \sigma_2, \dots, \sigma_N)$$

$$\mathcal{Z} = \sum_{\sigma_1, \dots, \sigma_N} \exp(-\beta \mathcal{H})$$

$$F(\beta) = -\frac{1}{\beta} \log(\mathcal{Z})$$



# Population Dynamics

On each directed edge  $i \rightarrow a$  and  $a \rightarrow i$ , there is a message.  
This message takes different values in different macrostates

$$P_{i \rightarrow a}(m_{i \rightarrow a}) = \frac{\prod_{b \in \partial i \setminus a} \left[ \int d\chi_{b \rightarrow i} \hat{P}_{b \rightarrow i}(\chi_{b \rightarrow i}) \right] e^{-y \Delta F_{i \rightarrow a}} \delta(m_{i \rightarrow a} - M(\{\chi_{b \rightarrow i} : b \in \partial i \setminus a\}))}{\prod_{b \in \partial i \setminus a} \left[ \int d\chi_{b \rightarrow i} \hat{P}_{b \rightarrow i}(\chi_{b \rightarrow i}) \right] e^{-y \Delta F_{i \rightarrow a}}}$$

$$\hat{P}_{a \rightarrow i}(\chi_{a \rightarrow i}) = \prod_{j \in \partial a \setminus i} \left[ \int dm_{j \rightarrow a} P_{j \rightarrow a}(m_{j \rightarrow a}) \right] \delta \left( \chi_{a \rightarrow i} - \prod_{j \in \partial a \setminus i} \frac{(1 - J_a^j m_{j \rightarrow a})}{2} \right)$$