

# Phase Transition of Inhomogeneous Random Graphs

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May 28, 2013

Joint work with Vlady Ravelomanana

- The inhomogeneous graphs model encodes several tractable SAT and CSP problems

*[Söderberg 02] [Bollobàs Janson Riordan 07]*

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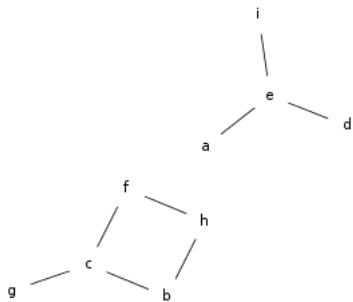
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- Asymptotic analysis of the number of inhomogeneous graphs (some differences with the original model)  
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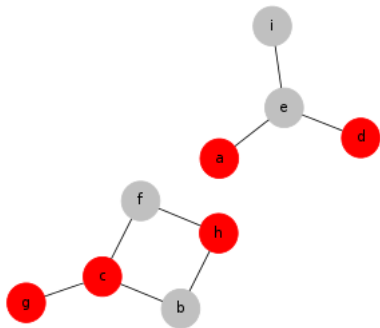
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probability for a graph to be bipartite [Pittel Yeum 10],  
probability of satisfiability of a quantified 2-XOR-SAT formula *[Creignou Daudé Egly 07]*

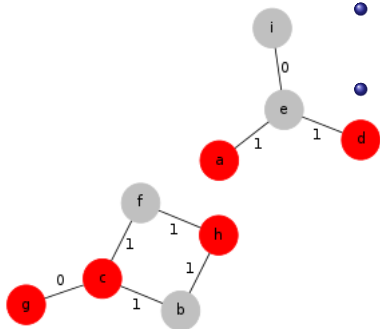
# Bipartite Graphs [Pittel Yeum 10]



- Each vertex  $v$  receives a color  $c(v)$ ,



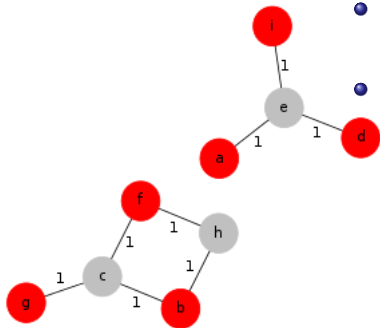




- Each vertex  $v$  receives a color  $c(v)$ ,
- the edges are weighted according to the color of their ends using  $R = \begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}$ ,
- weight  $\frac{1}{2}$  for each connected component.

$$\text{weight}(c(G)) := \left(\frac{1}{2}\right)^{\text{cc}(G)} \prod_{(a,b) \in E(G)} R_{c(a),c(b)}$$

weight = 0

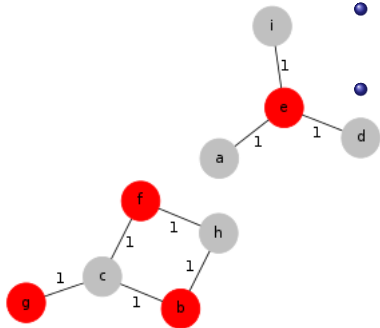


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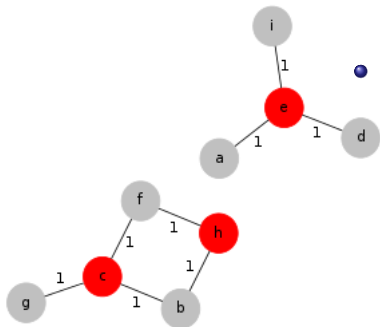


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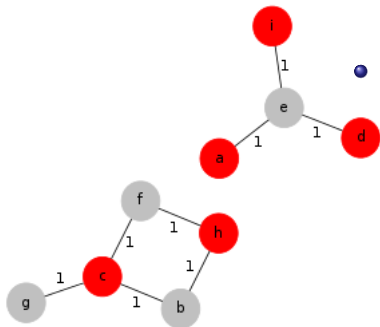
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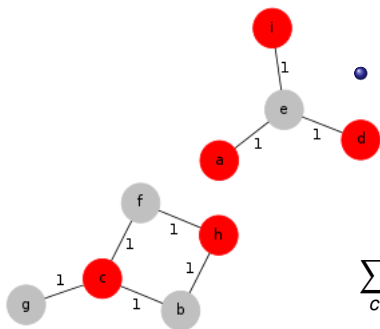
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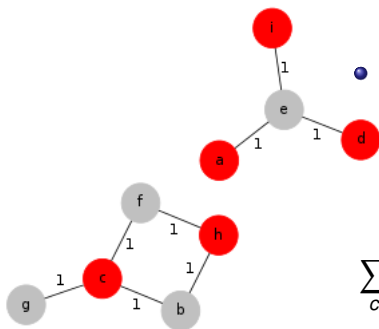


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The number of  $(n, m)$ -bipartite graphs is

$$g_{\begin{pmatrix} 0 & 1 \\ 1 & 0 \end{pmatrix}, \frac{1}{2}}(n, m) := \sum_{(n,m)\text{-graph } G} \sum_c \text{weight}(c(G)).$$

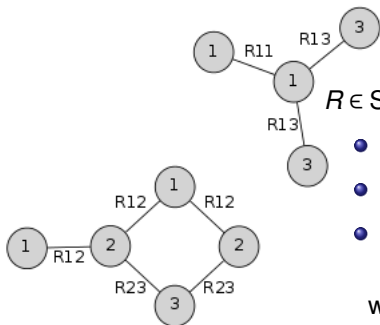
$R \in \text{Sym}_{q \times q}(\mathbb{R}_{\geq 0})$  and  $\sigma > 0$ . A  $(R, \sigma)$ -graph is:

- a vertex colored graph  $c(G)$ ,
- with weight  $R_{c(s),c(t)}$  on each edge  $(s, t)$ ,
- and weight  $\sigma$  for each connected component.

$$\text{weight}(c(G)) := \sigma^{\text{cc}(G)} \prod_{(a,b) \in E(G)} R_{c(a),c(b)},$$

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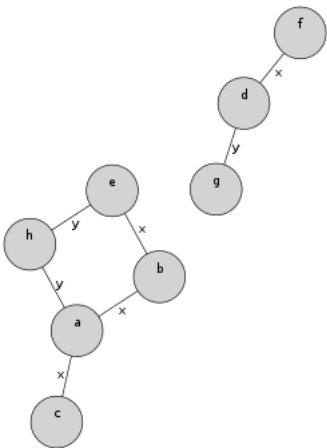
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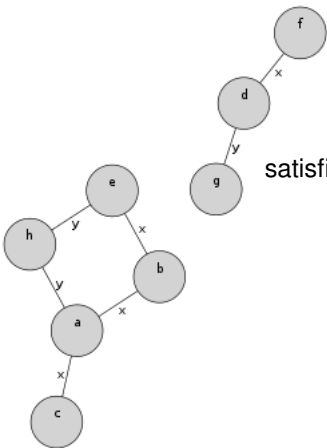
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$$\text{weight} = \sigma^2 R_{1,1} R_{1,2}^3 R_{1,3}^2 R_{2,3}^2$$

$$\forall x, y, \exists a, b, \dots, h, a \oplus b = x, a \oplus h = y, a \oplus c = x, \\ b \oplus e = x, d \oplus f = x, d \oplus g = y, e \oplus h = y$$

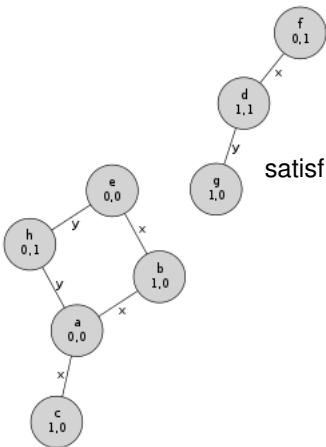


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satisfiable iff each cycle contains an even number of  $x$  and  $y$ .

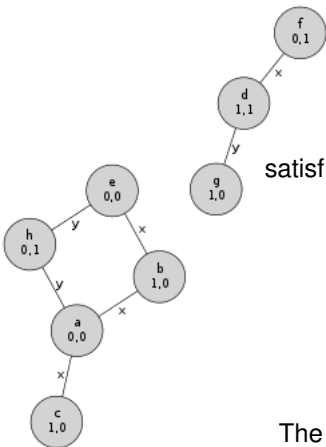


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00		$x$	$y$	
10	$x$			$y$
01	$y$			$x$
11		$y$	$x$	

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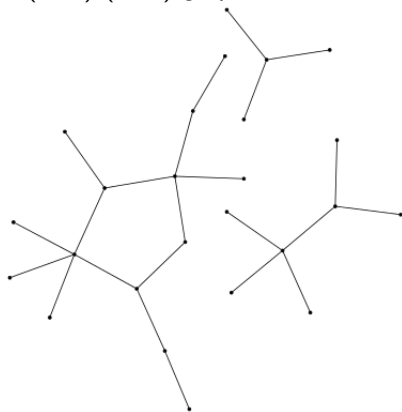
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The number of satisfiable quantified 2-Xor-Sat formulas with  $n$  existential variables and  $m$  clauses is  $g_{R,\sigma}(n, m)$ .

# Sub-Critical Density of Edges

When  $\frac{m}{n} < c(1 - \epsilon)$  and  $n \rightarrow \infty$ , with high probability a  $(n, m)$ - $(R, \sigma)$ -graph consists of trees and unicycle components.



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rooted tree  $T_i(z) = z \exp(\vec{R}_i \vec{T}(z))$

Symbolic method

$$z \partial \vec{T} = (I - \text{diag}(\vec{T}) R)^{-1} \vec{T}$$



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Drmotá-Lalley-Wood Theorem

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unrooted tree  $U = \overleftarrow{1} \overrightarrow{T} - \frac{1}{2} \overleftarrow{T} R \overrightarrow{T} \quad \sim u_0 + u_2 \left(1 - \frac{z}{\rho}\right) + u_3 \left(1 - \frac{z}{\rho}\right)^{3/2}$

## Dissymmetry Theorem

$$z \partial U = T_1 + \dots + T_q$$

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unicycle component  $V = -\frac{1}{2} \log(\det(I - \text{diag}(\overrightarrow{T})R))$

linear algebra

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$$g_{R, \sigma}(n, m) \sim n! [z^n] \frac{(\sigma U)^{n-m}}{(n-m)!} e^{\sigma V}$$

*Large Power* scheme [Flajolet Sedgewick 09]: one dominant saddle point.

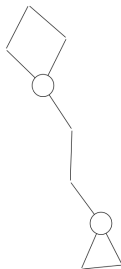
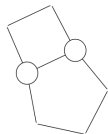
When  $\frac{m}{n} = c(1 + \mu n^{-1/3})$  where  $\mu = O(1)$ , with high probability a  $(n, m)$ - $(R, \sigma)$ -graph consists of

- trees and unicycle components,
- a cubic multigraph where the vertices are replaced by rooted trees and the edges by paths of trees.

# Critical Case

When  $\frac{m}{n} = c(1 + \mu n^{-1/3})$  where  $\mu = O(1)$ , with high probability a  $(n, m)$ - $(R, \sigma)$ -graph consists of

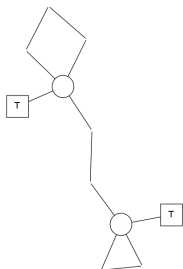
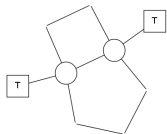
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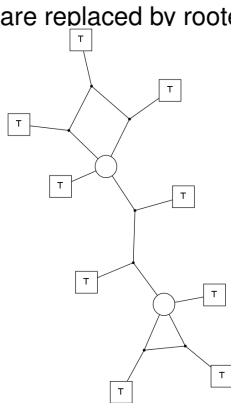
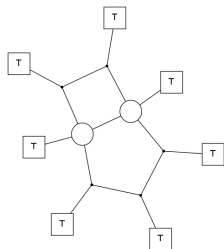
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In a cubic graph, each vertex owns  $3/2$  edges.

For the ordinary graphs, the gf of the developed cubic part is

$$\text{GF}_{\text{cubic}} \left( z \leftarrow T(z) \left( \frac{1}{1 - T(z)} \right)^{3/2} \right)$$

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$$g_{R,\sigma}(n, m) \sim n! [z^n] \sum_k \frac{(\sigma U)^{k+n-m}}{(k+n-m)!} \exp(\sigma V) \frac{e_k^{(\sigma)} (T_1 p_1^3 + \dots + T_q p_q^3)^{2k}}{\det(I - \text{diag}(\vec{T}) R)^{3k}}$$

Coalescence of two saddle points at the dominant singularity of  $\vec{T}(z)$   
[Janson Knuth Łuczak Pittel 93] or [Banderier Flajolet Schaeffer Soria 01].

# Results

New proof of the result of Pittel and Yeum on the probability of bipartiteness, new result on the probability of satisfiability of quantified 2-Xor-Sat formulas:

$$\frac{2m}{n} < 1 - \epsilon : \mathbb{P}(\text{sat}) \sim \frac{(1 - \frac{2m}{n})^{3/8}}{(1 + \frac{2m}{n})^{1/8}} \sqrt{1 - \frac{m}{n}},$$
$$\frac{2m}{n} = 1 + \mu n^{-1/3} : \mathbb{P}(\text{sat}) \sim \frac{\Phi_{1/4}(\mu)}{(2n)^{1/8}}.$$

$$\Phi_{\sigma}(\mu) = \sqrt{2\pi} \sum_k \frac{e_k^{(\sigma)}}{4^k} A(3k + \sigma/2, \mu)$$
$$e_k^{(\sigma)} = [z^{2k}] \left( \sum_n \frac{(6n)! z^{2n}}{(2n)!(3n)!2^n(3!)^n} \right)^{\sigma}$$
$$A(y, \mu) = \frac{e^{-\mu^3/6}}{3^{(y+1)/3}} \sum_k \frac{(3^{2/3} \mu/2)^k}{k! \Gamma((y+1-2k)/3)}$$

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- applications to the analysis of algorithms,
- generalisation to hypergraphs.