Phase transitions in combinatorial optimization problems Course at Helsinki Technical University, Finland, autumn 2007
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Remarks: Outline of Talk shoould be slide-wise, i.e. few keywords per slide.
(show sample talk of myself)
Missing appointments

### 3.3 Numerical Results

Ensemble $\mathcal{G}(N, c / N)$ of random graphs:
$N$ vertices, each poss. $N(N-1) / 2$ edge is present with prob. $c / N$.
$\rightarrow c=$ average degree
Here: $c=2.0$.

## Phase Transition



Figure 1: Probability $P_{\text {cov }}(x)$ that a VC exists for a random graph $(c=2)$ as a function of the fraction $x$ of covered vertices.
Three different system sizes $N=25,50,100$ (averaged over $10^{3}-10^{4}$ random graphs).
Left: average energy density $e(x)$.
Inset: result for the energy in the region $0.3 \leq x \leq 0.5$.

## Running time



Figure 2: Time complexity of the vertex-cover algorithm $=$ median number of nodes visited in the configuration. $N=20,25,30,35,40$, $c=2.0$. Right part ( $x>0.4$ ): Running times grows linearly. Inset: logarithmic scale (also $N=45,50) \rightarrow$ time complexity grows exponentially with $N$.

## Finit-Size Scaling

Determine $x_{\mathrm{c}}(N)$ for different graph sizes $N$
fit to the data a function

$$
\begin{equation*}
x_{\mathrm{c}}(N)=x_{\mathrm{c}}+a N^{-b} \tag{1}
\end{equation*}
$$

(frequently found behavior in physical systems)

Matches well:



Figure 3: Finite-size scaling behavior of the critical cover size. The location of the transition point $x_{\mathrm{c}}(N)$ as a function of graph size $N$ for different average degree $c$. Inset: scaling of the correlation volume as a function of $x$ for different sizes. Error bars are, at most, of the order of the symbol size.
$b$ does not depend much on the connectivity $c$ :
$b(c=2)=0.91(9), b(3)=0.88(4), b(4)=0.82(4), b(6)=0.92(11)$

## Phase diagram



Figure 4: Phase diagram. Circles: numerical simulations. Line: analytical result. Bounds: dashed/dashed-dotted lines. Vertical line at $c=e \approx 2.718$.

Analytical Result:

$$
\begin{equation*}
x_{\mathrm{c}}(c)=1-\frac{2 W(c)+W(c)^{2}}{2 c} \tag{2}
\end{equation*}
$$

$W(c)$ : Lambert-W function: $W(c) \exp (W(c))=c$.
Result exact until $c=e \approx 2.718$ : Assumption of Replica symmetry (RS) ( $\leftrightarrow$ simple organisation of phase space) is true.
$c>e$ : Replica symmetry breaking ( RSB ) ( $\leftrightarrow$ complex phase space) $\rightarrow$ cannot be calculated exactly here.



Note: percolation at $c_{\text {crit }}=1.0<e$ !

### 3.4 Leaf-Removal algorithm

Speed up for finding minimum-size VCs (optimization problem 2)
Basic idea: only full VCs wanted
$\rightarrow$ all edges must be covered
$\rightarrow$ all edges $\{i, l\}$ to leaves $l$ (degree 1) must be covered
$\rightarrow$ either $i$ or $l$ must be covered
$\rightarrow$ no harm in covering $i$, i.e. neigbours of leaves.
$\rightarrow$ all edges incident to $i$ are covered
$\rightarrow$ maybe more leaves generated
algorithm leaf-removal $(G=(V, E))$
begin
Initialize $V^{\prime}=\emptyset$
while there are leaves $i$ (i. e.vertices with degree $d_{i}=1$ ) do
begin
Let $j$ be the neighbor of a leaf $i$
cover $j$, i. e., $V^{\prime}=V^{\prime} \cup\{j\}$
Remove all edges adjacent to $j$ from $E$
Remove $i$ and $j$ from $V$
end
return $\left(V^{\prime}\right)$
end

Running time: $\mathcal{O}(M)(=O(N)$ for random graphs with fixed $c)$
Remaining graph: called core
Each component of core: treated with brand-and-bound algorithm.

Example: Leaf removal


Figure 5: Example of the leaf-removal algorithm. Upper left: initial graph, vertices 1 and 2 are leaves. Upper right: graph after the first iteration, vertex 5 has been covered (shown in bold) and the incident edges removed (shown with dashed line style). Bottom: graph after second and third iteration.

Previous sample graph
Two leaves, vertices 1 and 2

Iteration 1: say vertex 5 (neighbor of 2 ) is covered. (edges $\{2,5\}$ and $\{5,8\}$ are covered and removed)

It. 2: v. 3 covered (neighbor of 1$)(\rightarrow$ edges $\{1,3\}$ and $\{3,6\}$ )
$\rightarrow$ new leaf (vertex 6 )

It. 3: v. 7 covered (neighbor of 6)
$\rightarrow$ just one egde left (i.e. two leaves 4,8 )
It. 4: v. 8 covered
$\rightarrow$ min. VC found!

Note: for random graphs, connectivities $c<e$ : core is not extensive
$\rightarrow$ core $=$ collections of components of $\mathcal{O}(\log N)$ (Bauer and Golinelli, Europ. Phys. J. B 24, 339 (2001))
$\rightarrow$ per component: running time of brand-and-bound algorithm exponential in $\log N$, i.e. polyonmial in $N$
$\rightarrow$ min VC can be found typically in $\mathcal{O}\left(N^{k}\right)$ for $c<e$.

### 3.5 Monte Carlo (MC) simulations

General simulation approach used in (statistical) physics.
See books:

- M. E. J. Newman und G. T. Barkema, Monte Carlo Methods in Statistical Physics (Clarendon Press, Oxford, 1999).
- D. P. Landau and K. Binder, A Guide to Monte Carlo Simulations in Statistical Physics, (Cambridge University Press, Cambridge 2000).

Works very well for VC on random graphs, even for large $c$.
Basic idea: interpret VCs as configuration of physical system, a hard-core lattice gas, MC introduces a dynamics into the system. Idea: dynamic is guided to lead into minimum VCs.

### 3.5.1 The hard-core lattice gas

Arbitrary covers $V_{\mathrm{vc}}$ on graph $G=(V, E)$ including those larger than the minimum VC:
$\rightarrow$ at least at one end-point of any edge there is a covering mark

Define uncovered vertices as occupied by particles.
$\rightarrow$ not allowed: particles at both endpoints of an edge particles have chemical radius of one $=$ a hard-core repulsion


