

Title: Phase transitions in N-SAT

Date: Feb 10, 2006 04:00 PM

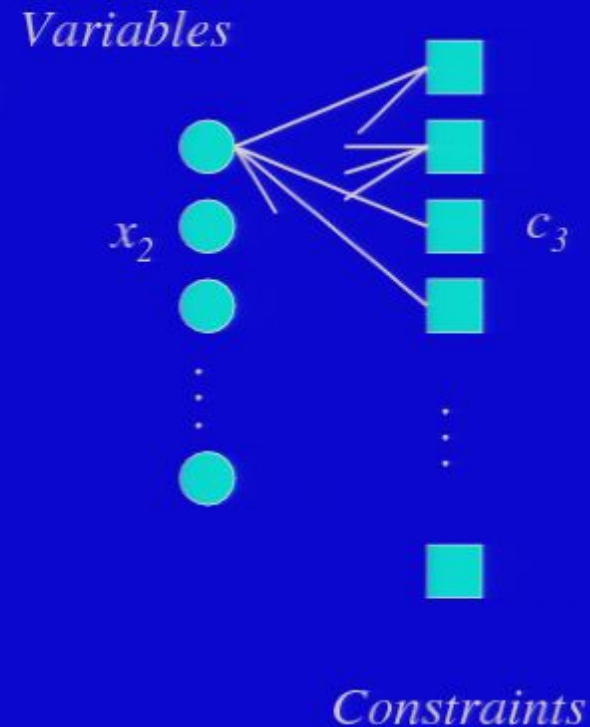
URL: <http://pirsa.org/06020021>

Abstract:

# The Setting: Random CSPs

- $n$  variables with small, discrete domains
  - $m$  competing constraints
- 

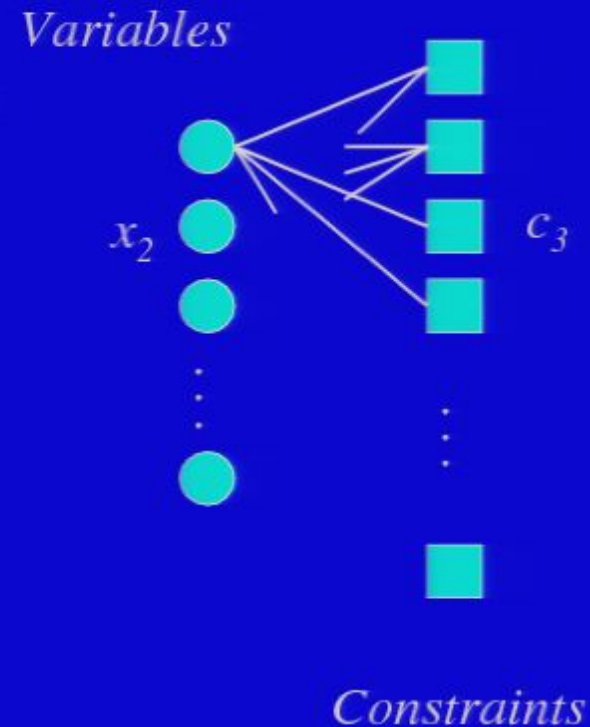
- Random bipartite graph:
- Sparse graph, i.e.  $m = \Theta(n)$



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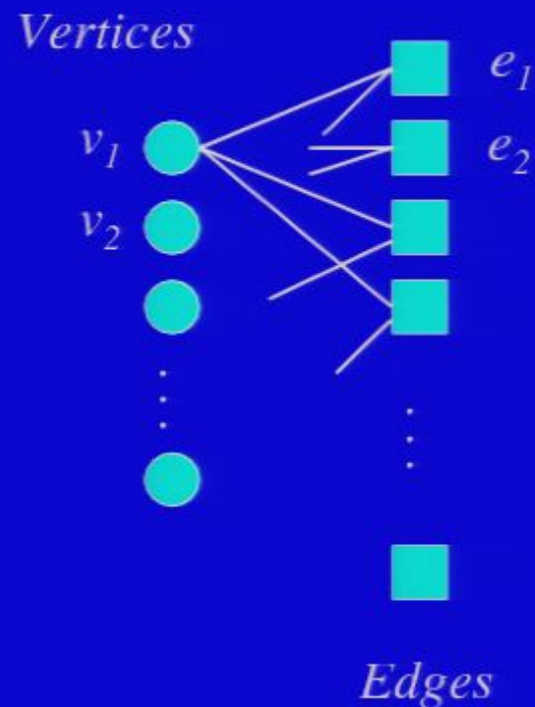
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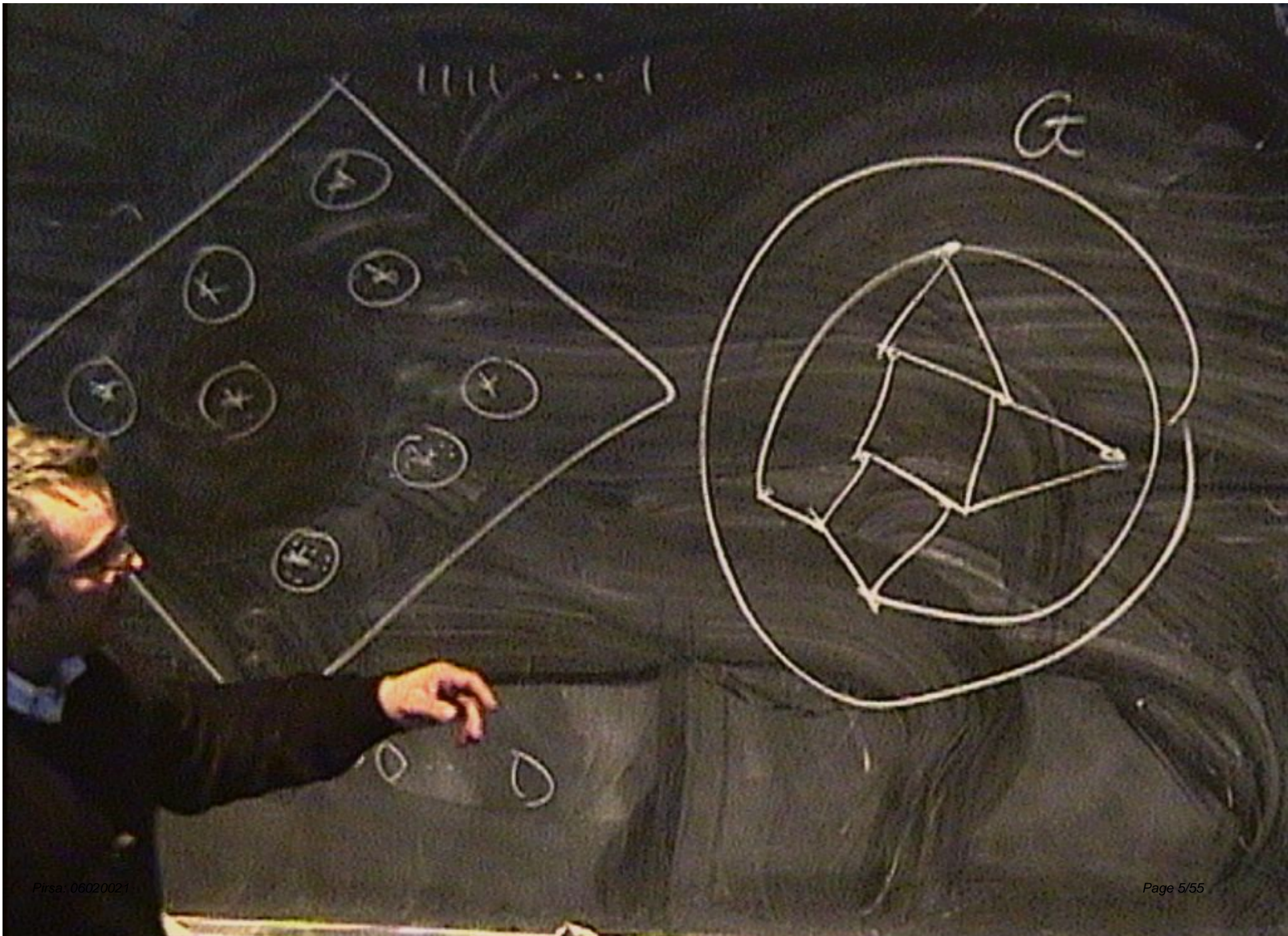
## Random Graph k-coloring

- Each **vertex** is a variable with domain  $\{1, 2, \dots, k\}$
  - Each **edge** is a "not-equal" constraint on two variables
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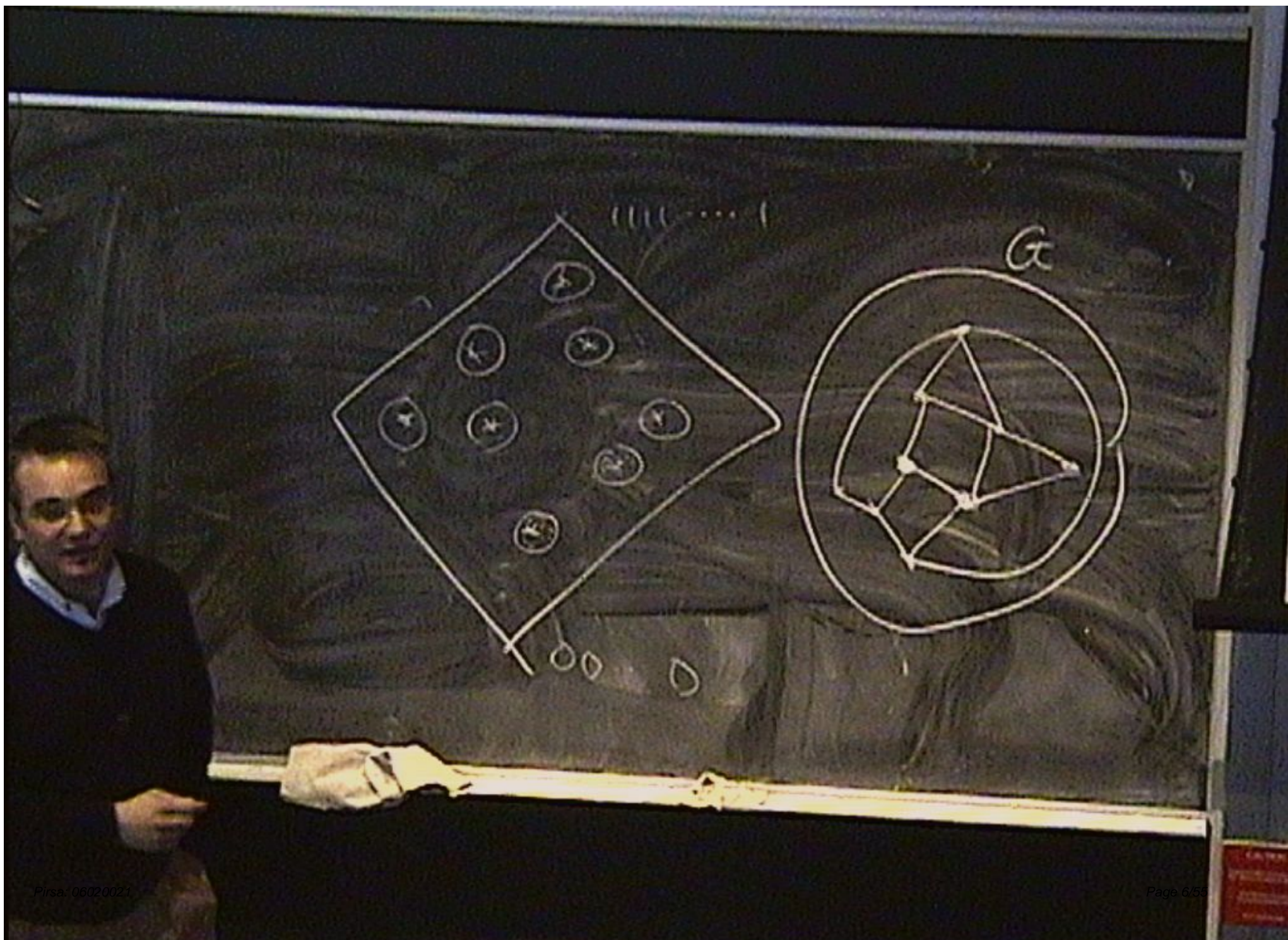
- $G(n, m)$  random graph: the two variables are chosen randomly
- Random **r-regular**: each variable is chosen  $r$  times







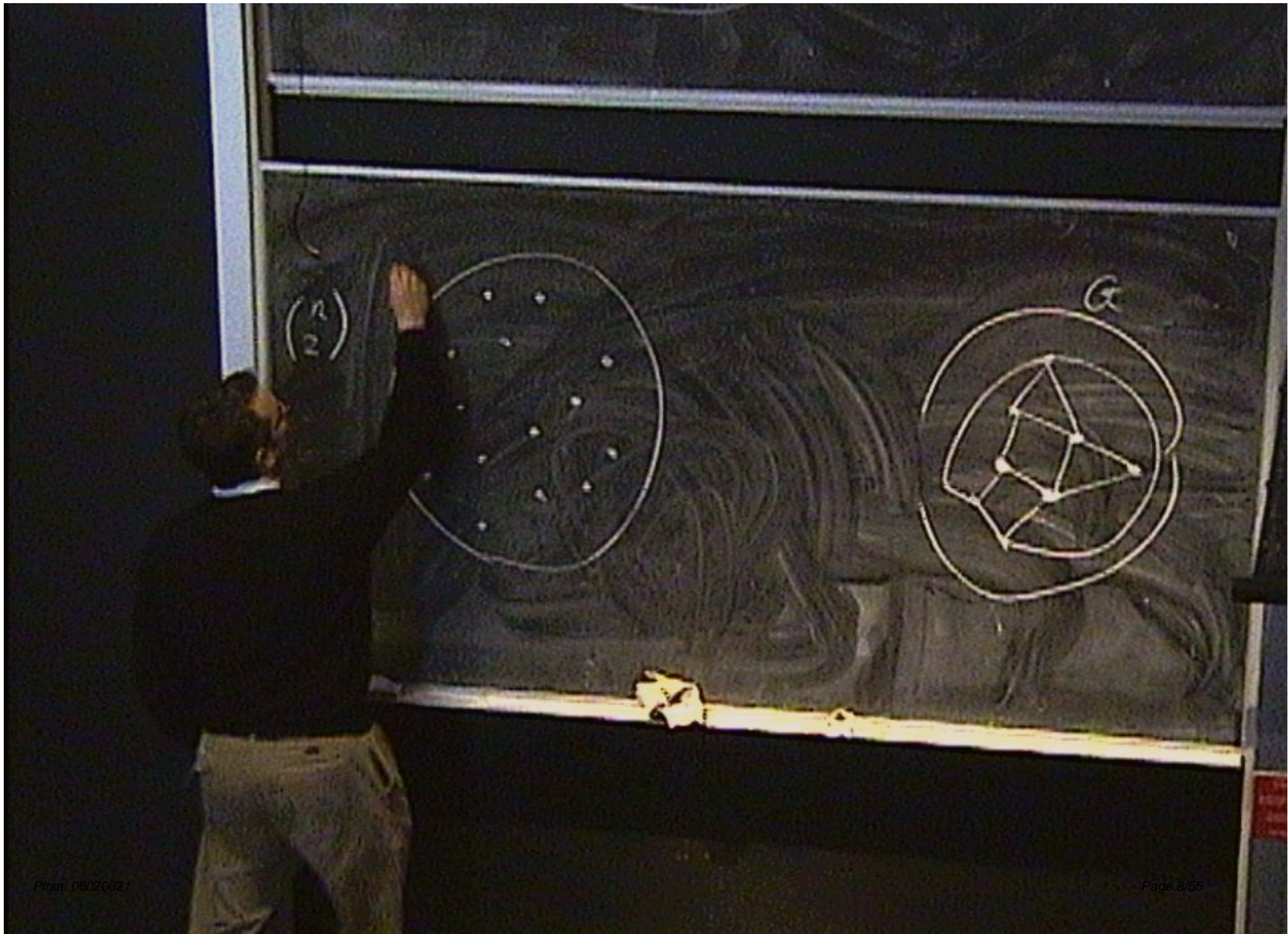














$G(n, p)$

$\binom{n}{2}$



$G$





$G(n, p)$

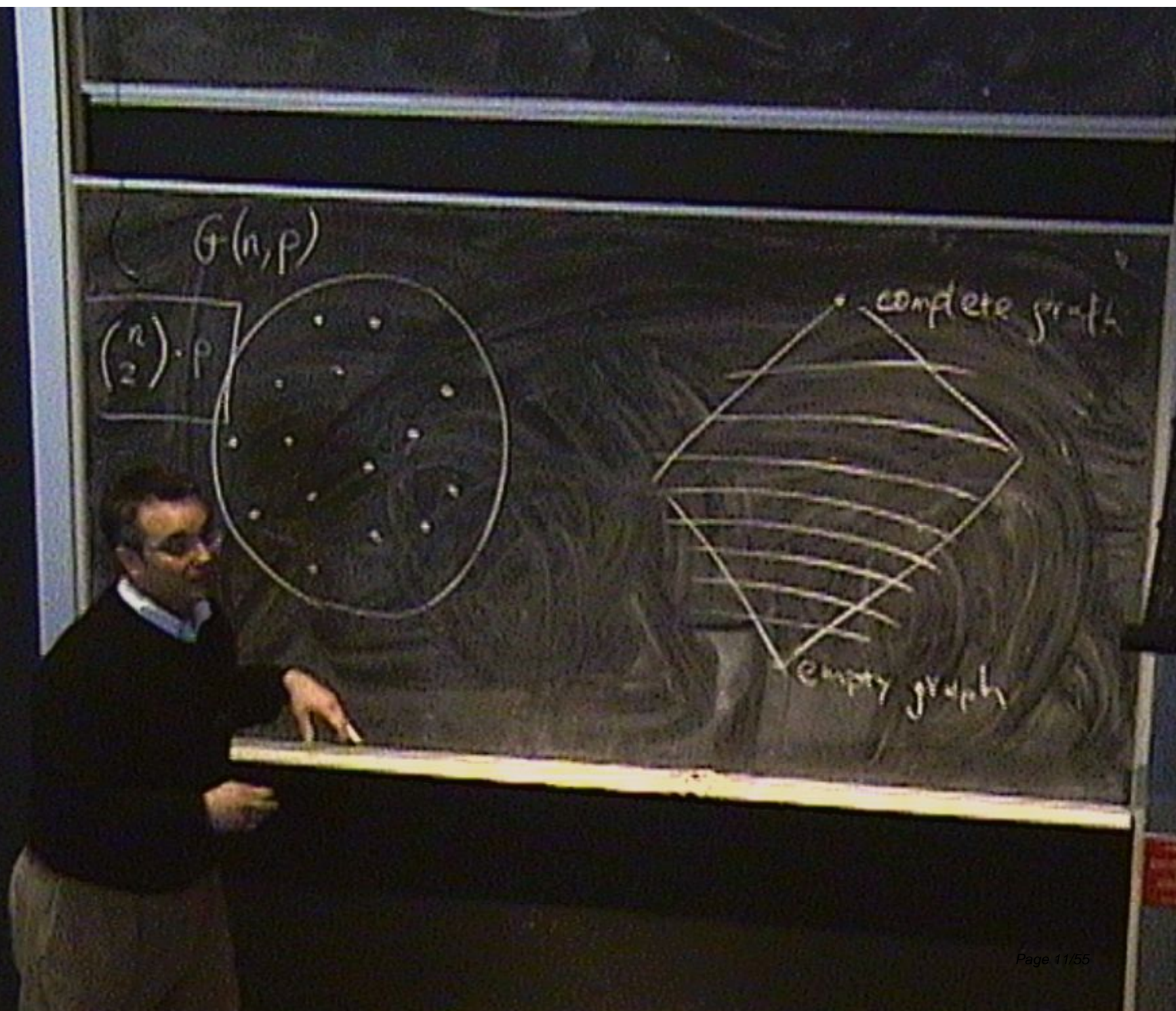
$$\binom{n}{2} \cdot p$$



$G$





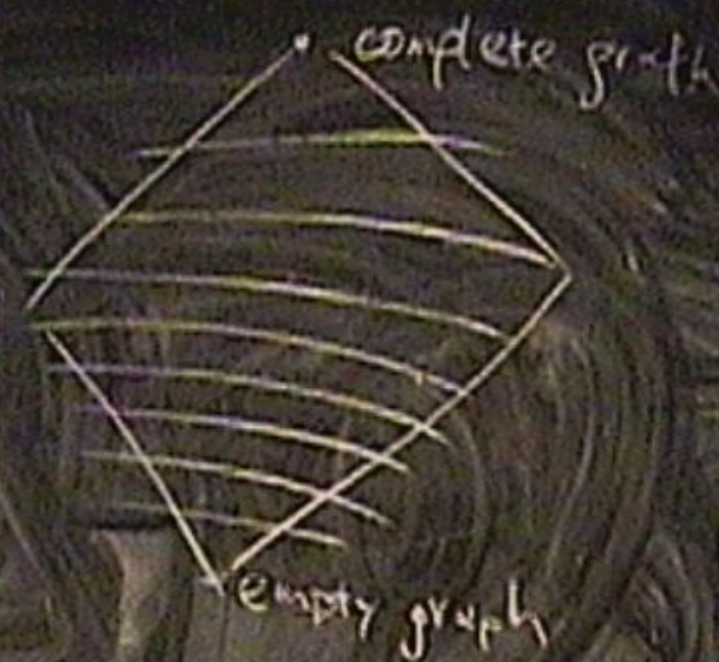




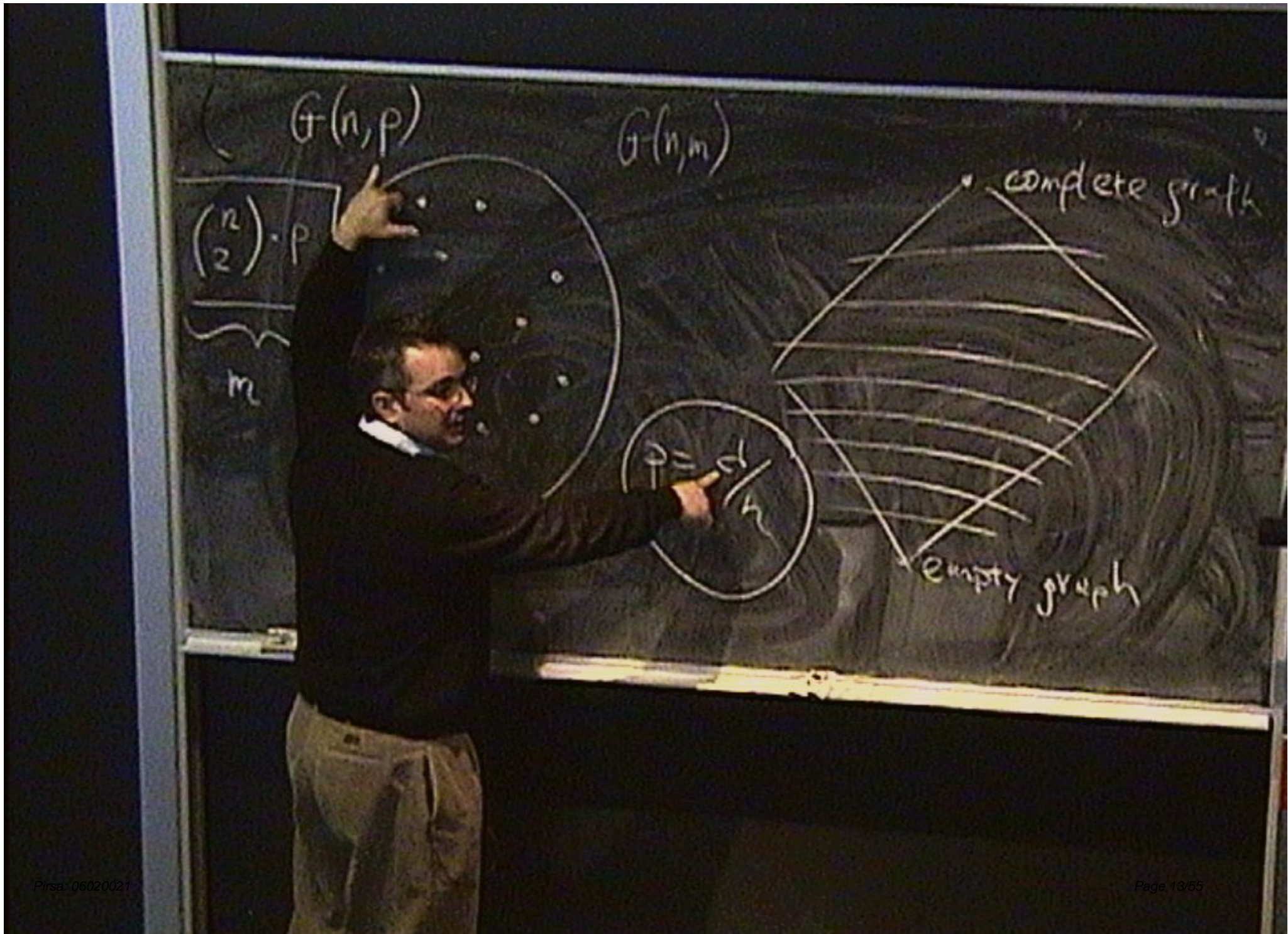
$G(n, p)$

$$\binom{n}{2} \cdot p$$

$m$







$G(n, p)$

$$\frac{\binom{n}{2} \cdot p}{m}$$

$m$

$G(n, m)$

$$p = \frac{cl}{h}$$

complete graph

empty graph



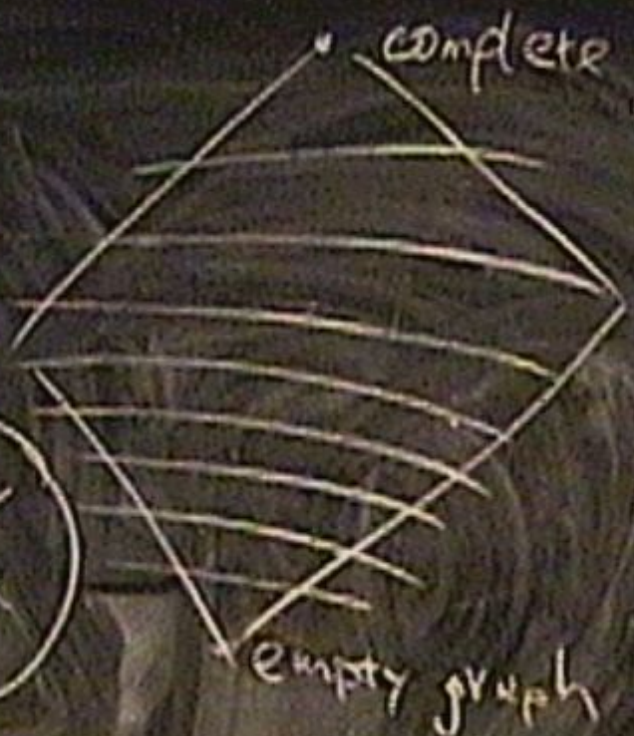
$G(n, p)$

$$\underbrace{\binom{n}{2} \cdot p}_m$$

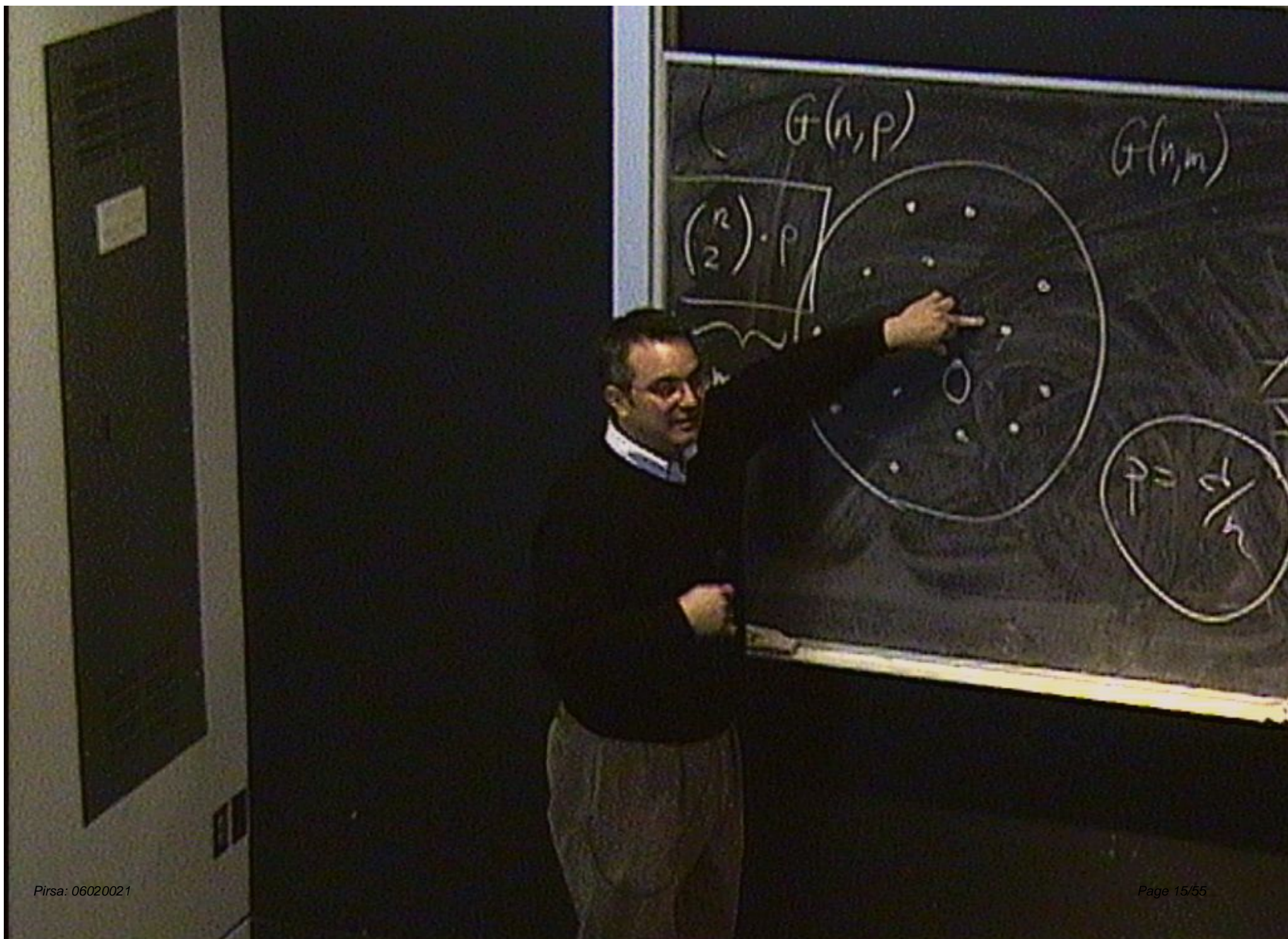


$G(n, m)$

$$p = \frac{m}{\binom{n}{2}}$$









$$G(n, p)$$

$$G(n, m)$$

$$\binom{n}{2} \cdot p$$

$m$



$2m$  ind



$$G(n, p)$$

$$G(n, m)$$

$$\binom{n}{2} \cdot p$$

$m$



$2m$

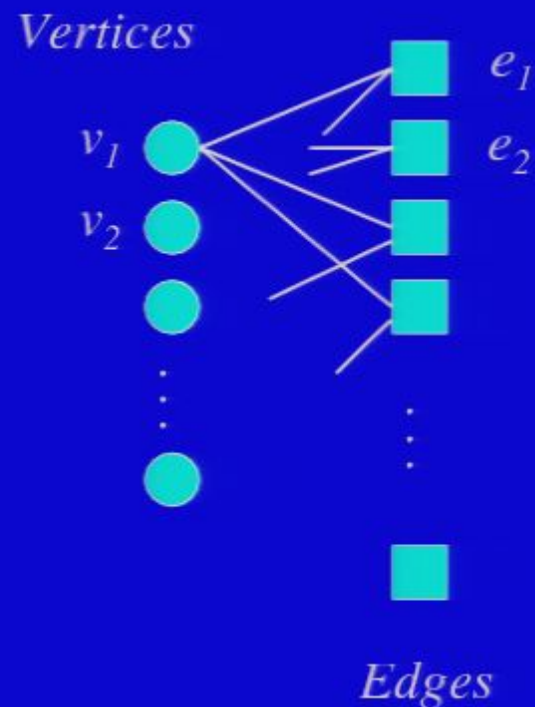
$ind$



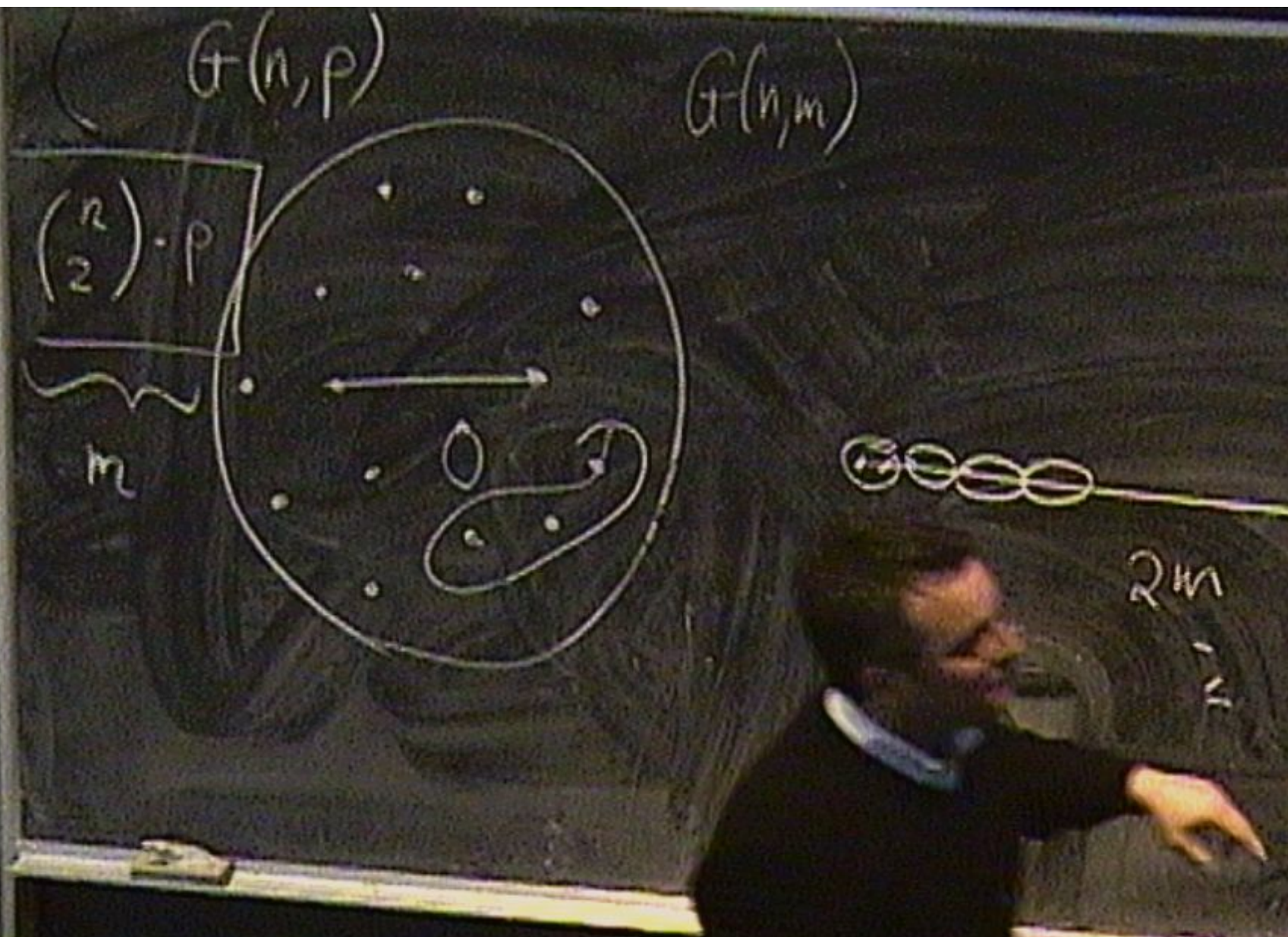
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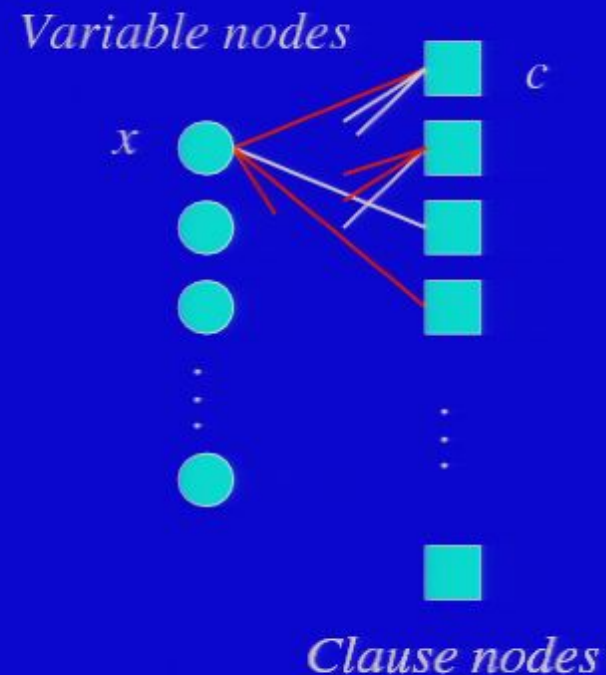






# Random k-SAT

- Variables are binary.
- Every constraint (**k-clause**) binds k variables.
- Forbids exactly one of the  $2^k$  possible joint values.
- Random k-SAT = each clause picks k random literals.



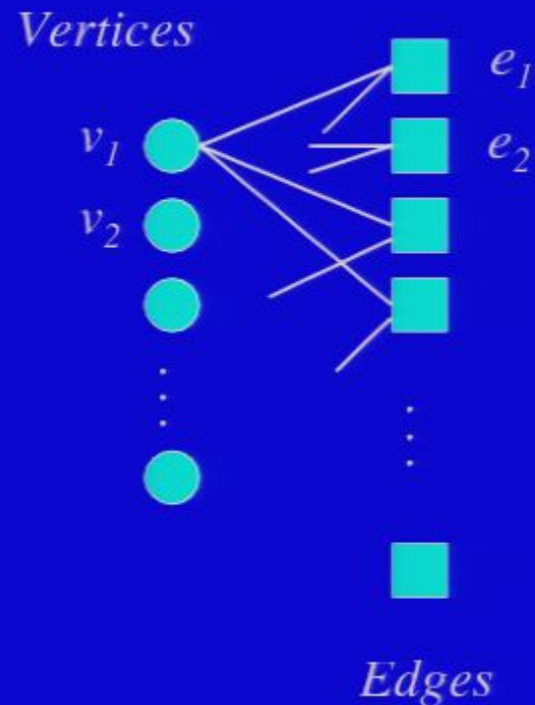
Similarly: NAE k-SAT, hypergraph 2-coloring, XOR-SAT...



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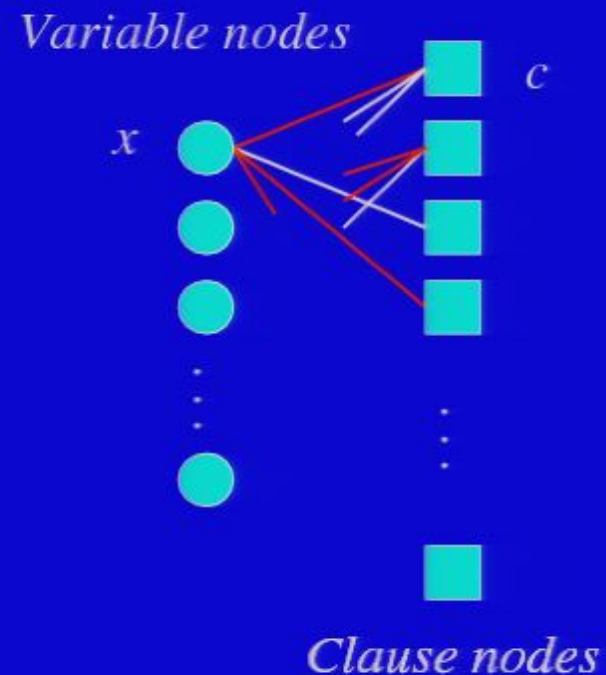
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## A simple $k$ -coloring algorithm

- Repeat
  - Pick a random uncolored vertex
  - Assign it the lowest **allowed** number (color)

Works when  $d \leq k \log k$

[Bollobás, Thomasson 84]

[McDiarmid 84]

- There are no  $k$ -colorings for  $d \geq 2k \log k$



## Twice as good is possible

As  $d$  grows,  $G(n, d/n)$  is  $k$ -colorable for

$$d \sim 2k \log k$$

[Shamir, Spencer 87], [Bollobás 89], [Frieze 90], [Łuczak 91]



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Average degree	$10^{60}$	$10^{80}$	$10^{100}$	$10^{130}$	$10^{1000}$
$\times k \log k$	1.01	1.12	1.19	1.31	1.75



## Only two possible values

**Theorem.** For every  $d > 0$ , there exists an integer  $k = k(d)$  such that w.h.p. the chromatic number of  $G(n, p = d/n)$

is either  $k$  or  $k + 1$

[Łuczak 91]

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 $G(n, p = d/n)$

is either  $k$  or  $k + 1$

where  $k$  is the smallest integer s.t.  $d < 2k \log k$ .

[A., Naor '04]

## Examples

- If  $d = 7$ , w.h.p. the chromatic number is 4 or 5.



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- If  $d = 10^{60}$ , w.h.p. the chromatic number is

3771455490672260758090142394938336005516126417647650681575

or

3771455490672260758090142394938336005516126417647650681576

## Random regular graphs

**Theorem.** For every integer  $d > 0$ , w.h.p. the chromatic number of a random  $d$ -regular graph

is either  $k$ ,  $k + 1$ , or  $k + 2$

where  $k$  is the smallest integer s.t.  $d < 2k \log k$ .

[A., Moore '04]



## Bounds for the k-SAT threshold

[A., Peres '04]

For all  $k \geq 3$ :

$$2^k \ln 2 - k < r_k < 2^k \ln 2$$

$k$	3	4	5	7	10	20	21
Upper bound	4.51	10.23	21.33	87.88	708.94	726,817	1,453,635
Lower bound	3.52	7.91	18.79	84.82	704.94	726,809	1,453,626
Best algorithm	3.52	5.54	9.63	33.23	172.65	95,263	181,453

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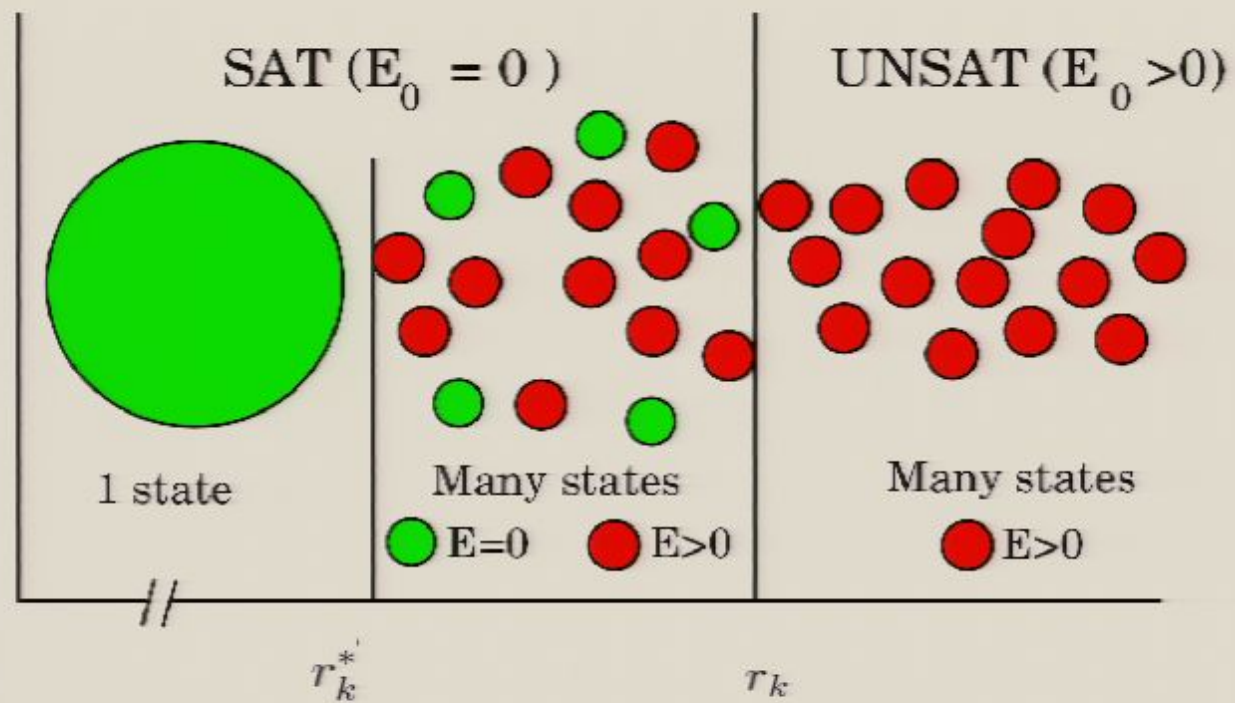
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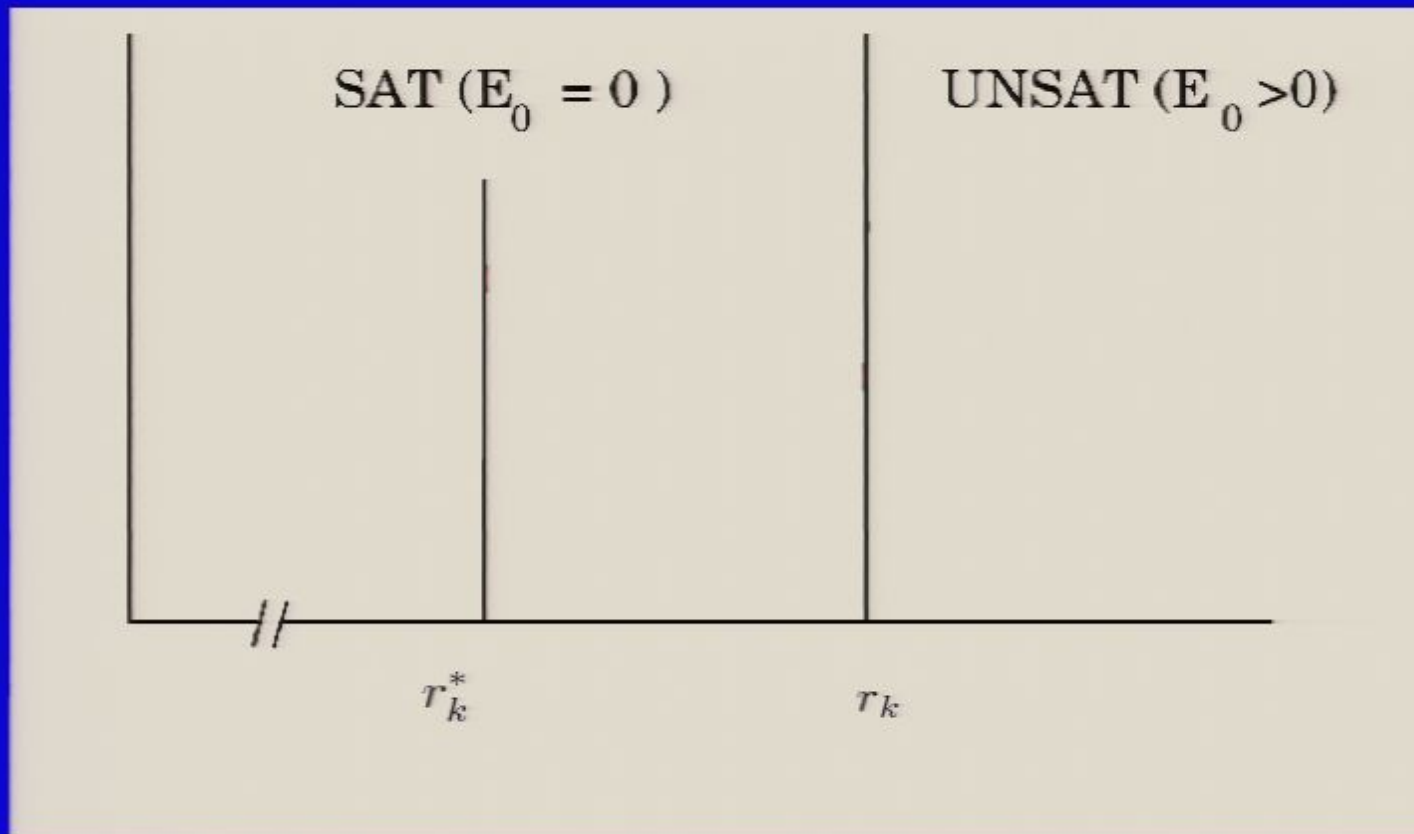
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They say....

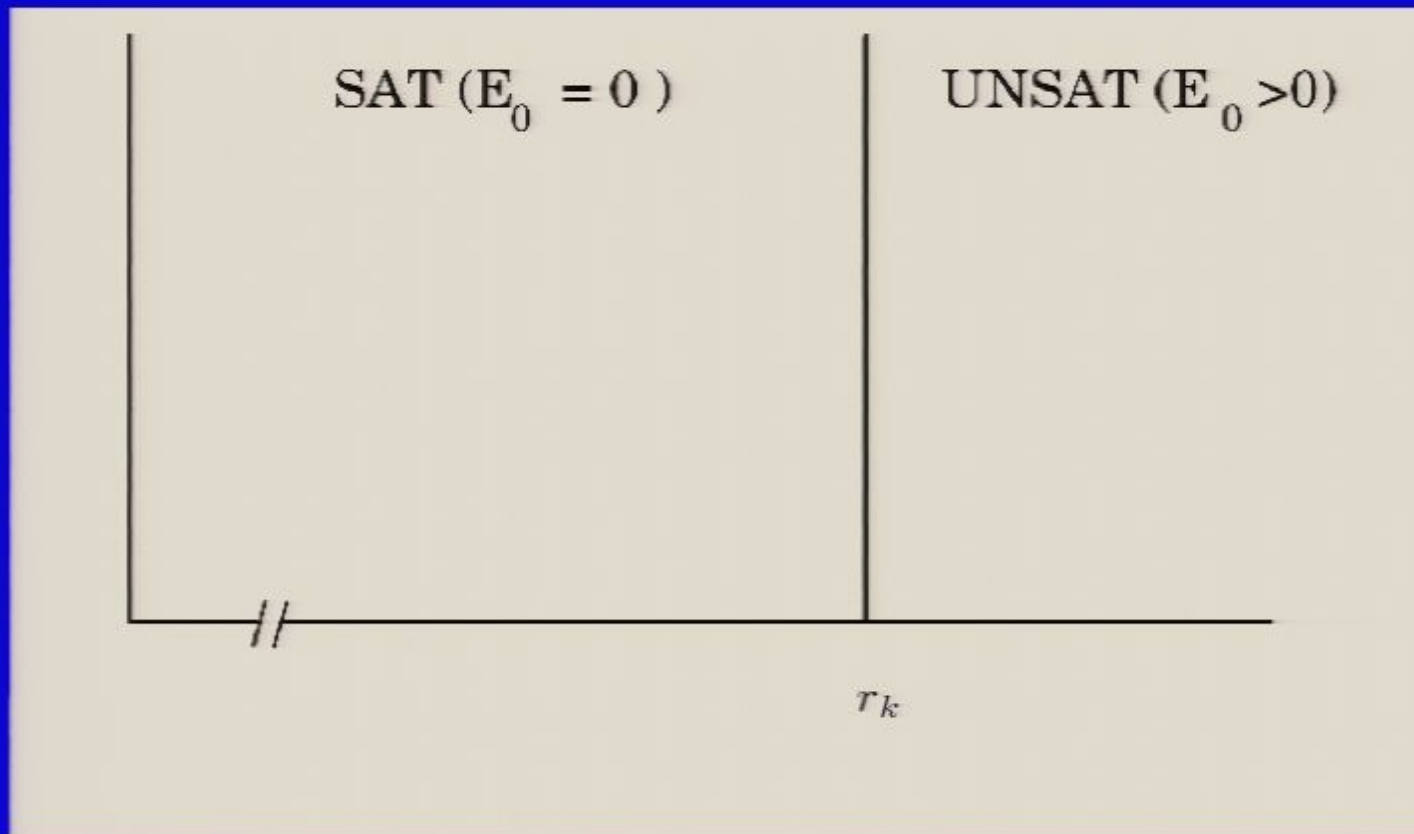


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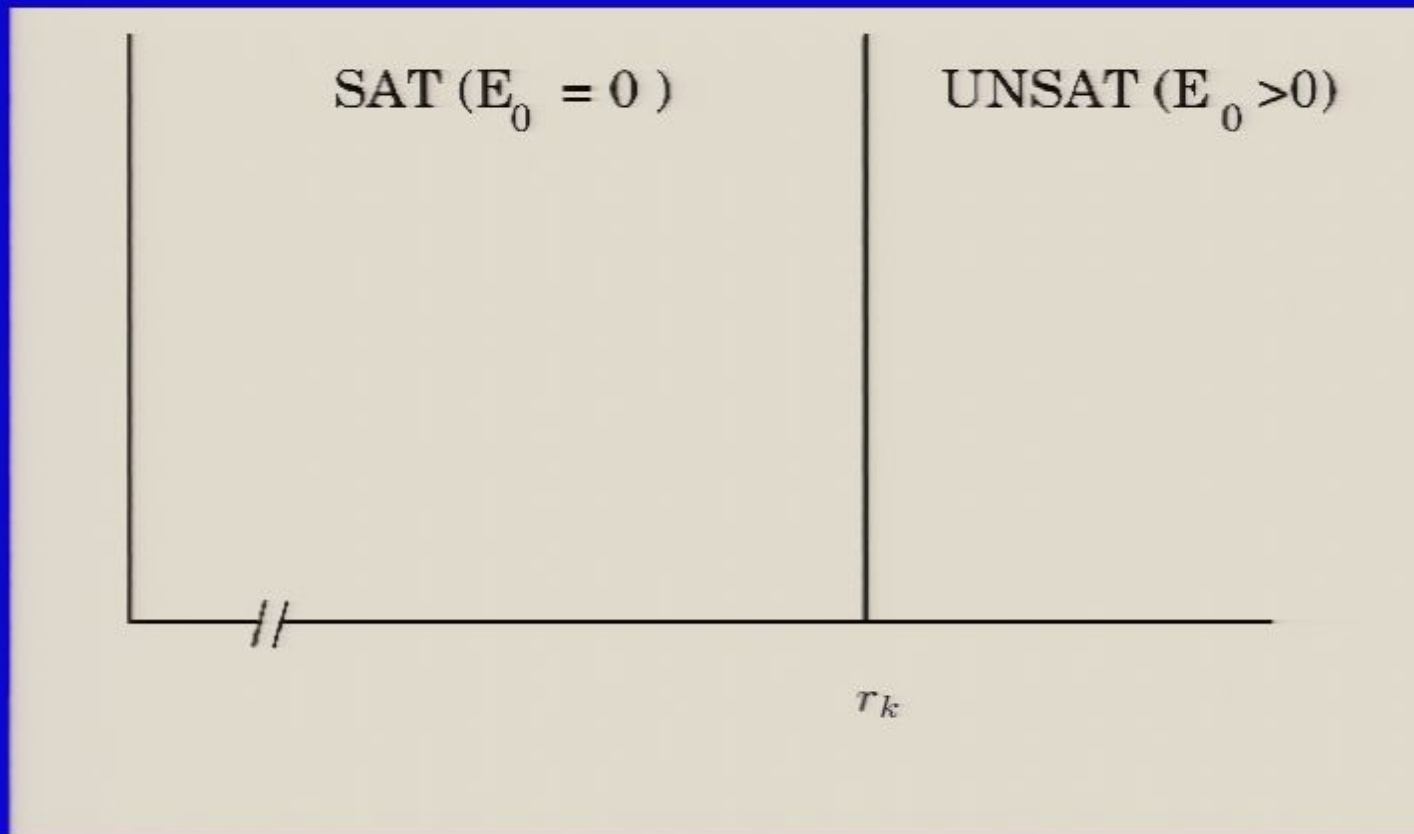




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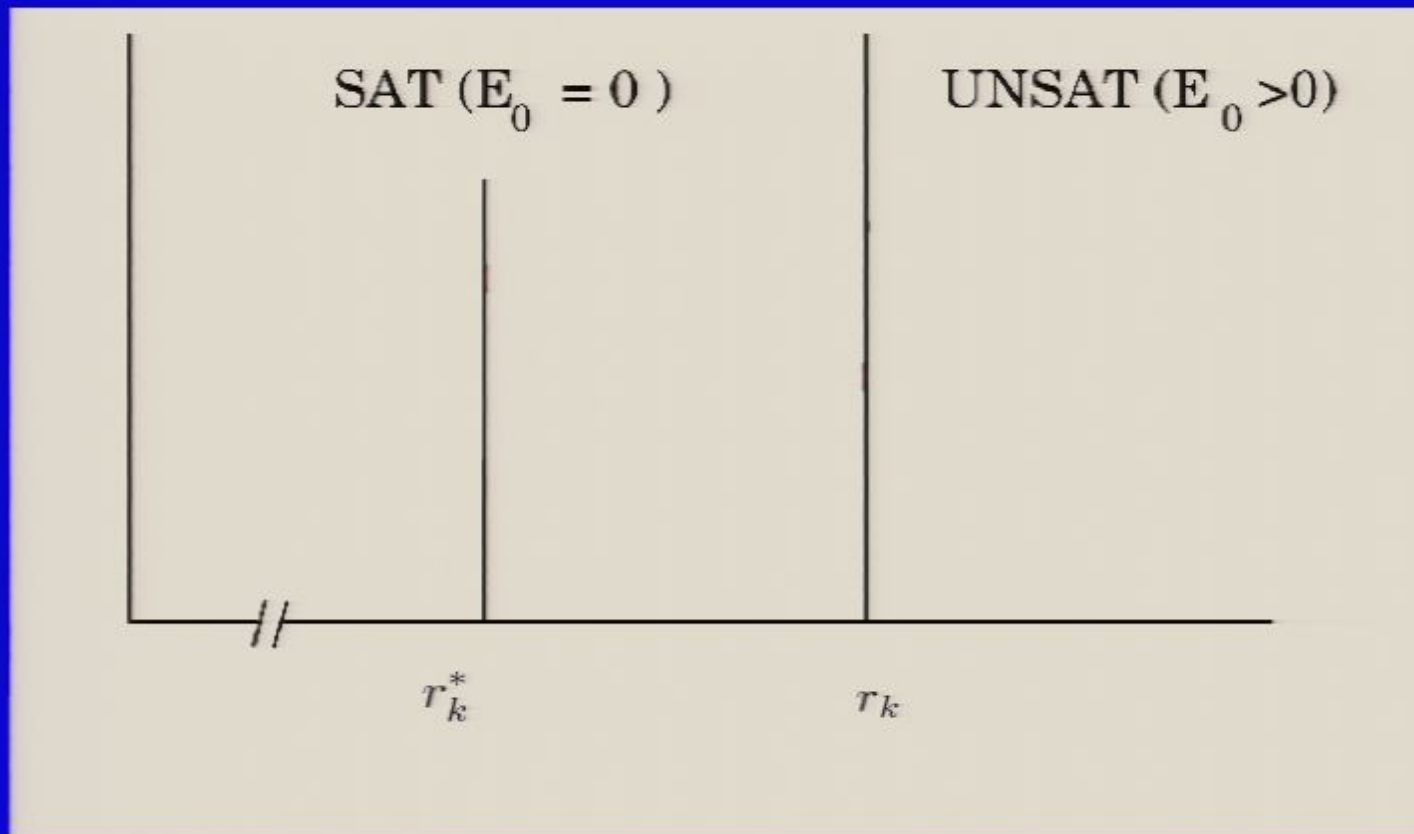


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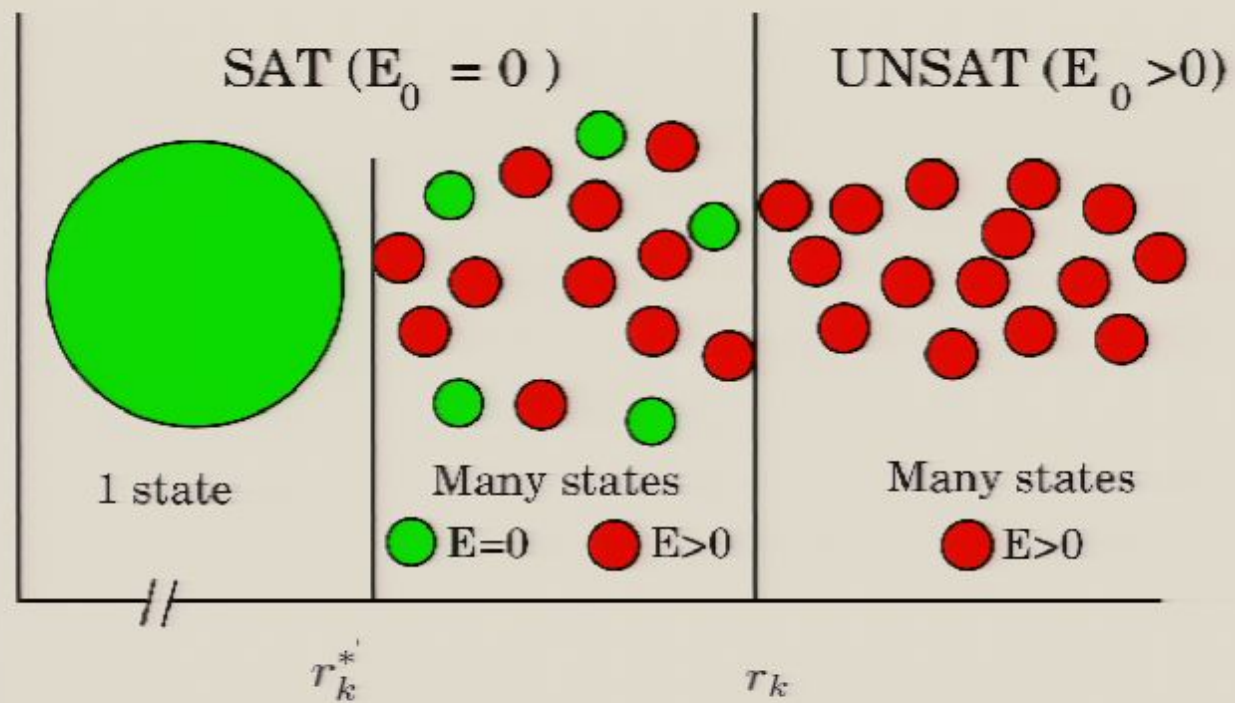




They say....



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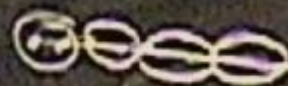
$$G(n, p)$$

$$\binom{n}{2} \cdot p$$

$m$

$$c \cdot 2^{5/2}$$

$$2^F \ln n$$



$2m$

iid

$\leq$



$$G(n, p)$$

$$\binom{n}{2} \cdot p$$

$m$



$$c = 2^{1/k}$$

$$\frac{2^k}{k} \lg k$$

$$2^k \lg n$$



$$2m$$

ind



$$G(n, p)$$

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$m$

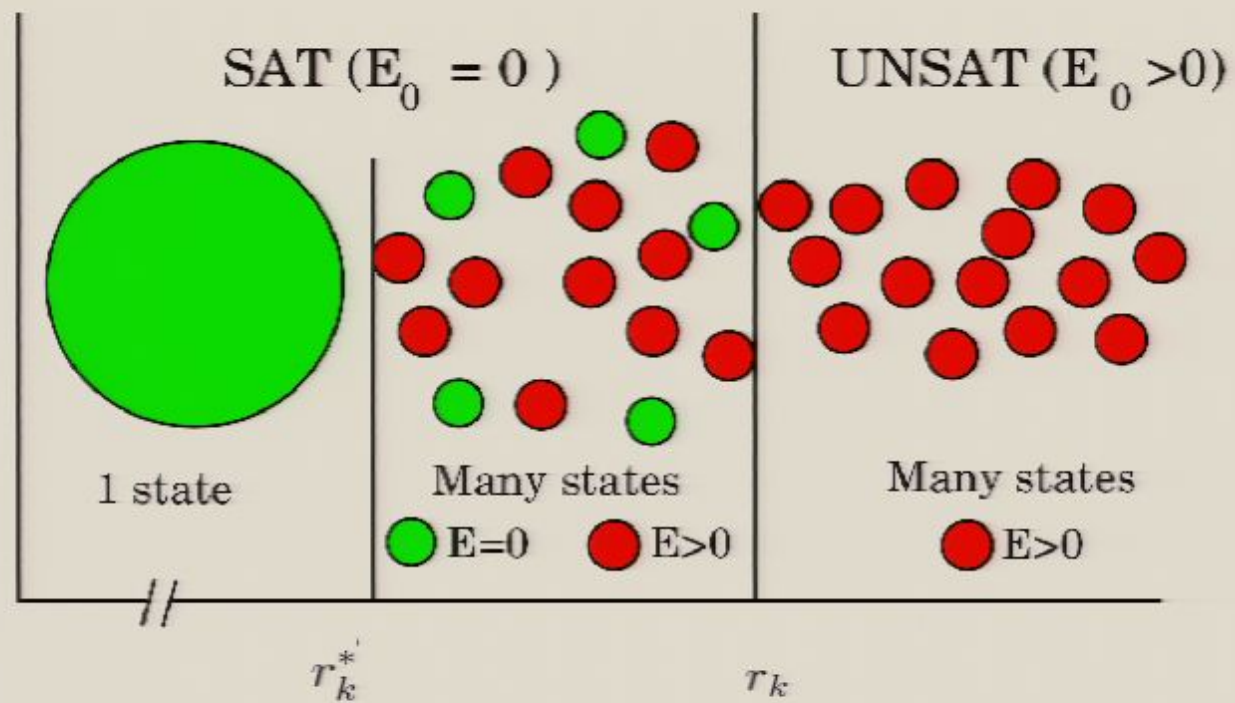
$$c \cdot 2^{5/2}$$

$$2^E \ln n$$

$$\frac{2^E}{k} \log k$$

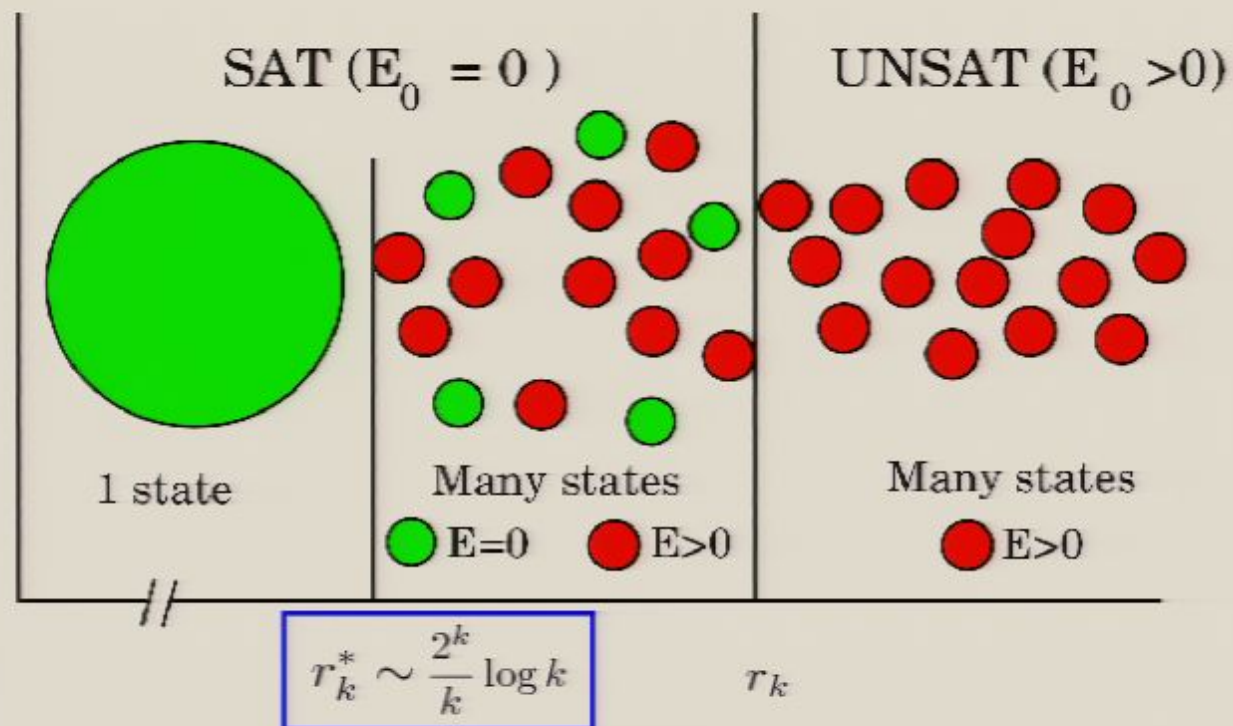
$$2m \quad \text{ind}$$

They say....





They say....



They are right!

For  $r > 2^{k-1} \ln 2$  it is easy to prove:

- Small diameter
- Far apart from one another
- Exponentially many

[Mora, Mezárd, Zecchina '05] [A., Ricci-Tersenghi '05]



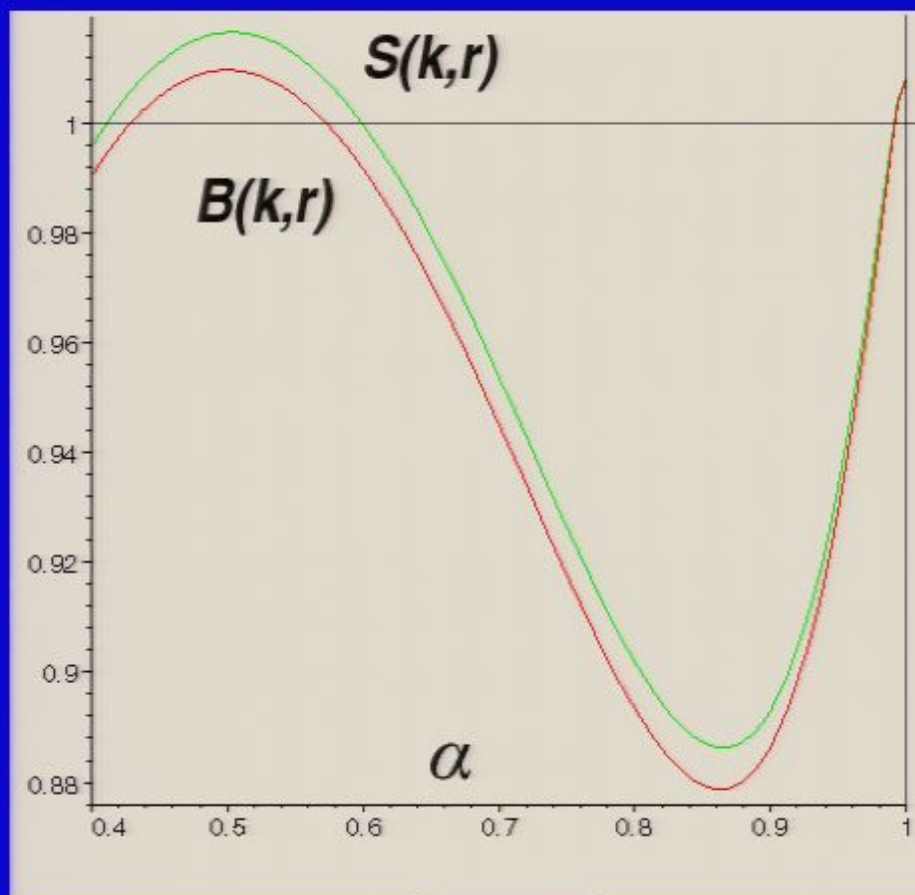
## Random 10-SAT, $r=700$

The expected number of pairs of satisfying assignments having overlap  $\alpha n$  is

$$S(k,r)^n \times \text{poly}(n)$$

The expected number of pairs of **balanced** sat. assignments having overlap  $\alpha n$  is

$$B(k,r)^n \times \text{poly}(n)$$



## Long-range dependencies

between the marginals over truth assignments

- Approximate the fraction  $p_i$  of satisfying truth assignments in which variable  $x_i$  takes value 1.
- Set  $x_i$  to 1 with probability  $p$  and simplify.



## Long-range dependencies

between the marginals over truth assignments

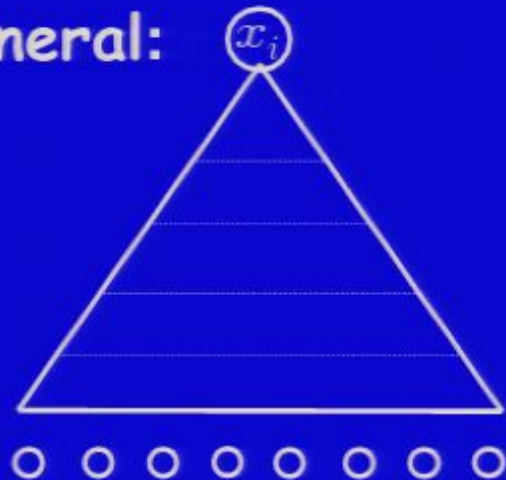
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In general:



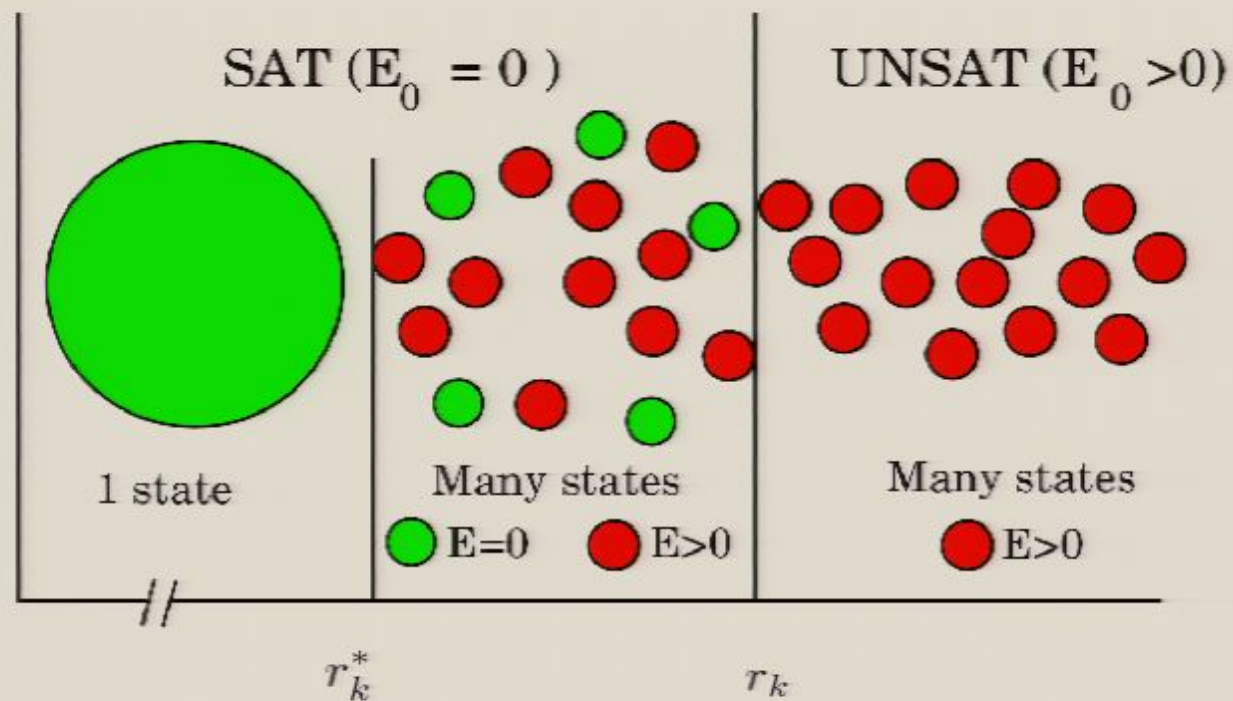
Given boundary  $\Lambda$ :

compute  $p_\Lambda$

$$p_i = \sum_{\Lambda} p_{\Lambda} \times \text{Ext}(\Lambda)$$



## How do we overcome this?



$p_{10}$   $p_{20}$   
 $p_{11}$   $p_{21}$   
 $p_{1*}$   $p_{2*}$



$p_{10}$   $p_{20}$

$p_{11}$   $p_{21}$

$p_{1*}$   $p_{2*}$

\*

1

1

\*

\*

1

0

0



$p_{10}$   $p_{20}$

$p_{11}$   $p_{21}$

$p_{1*}$   $p_{2*}$

$*$   $1$   $1$   $*$   $*$   $1$   $0$   $0$   $1$   $*$



$p_{10}$        $p_{20}$

$p_{11}$        $p_{21}$

$p_{1*}$        $p_{2*}$

$*$        $1$        $1$        $*$        $*$        $1$        $0$        $0$        $1$        $*$

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