

Computational Complexity

Lecture 2
in which we talk about
NP-completeness
(reductions, reductions)

Recap

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- Today: Hardest problems in NP

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 - if can decide L_2 , can decide L_1

Turing and Many-One

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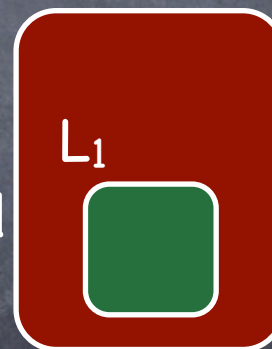
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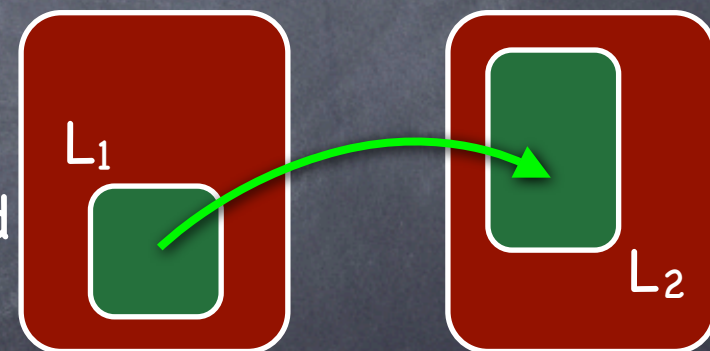
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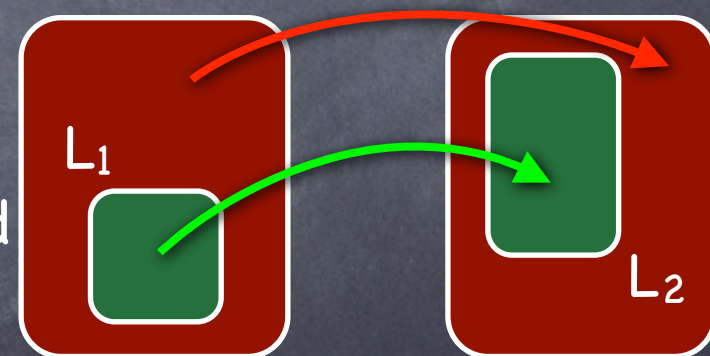
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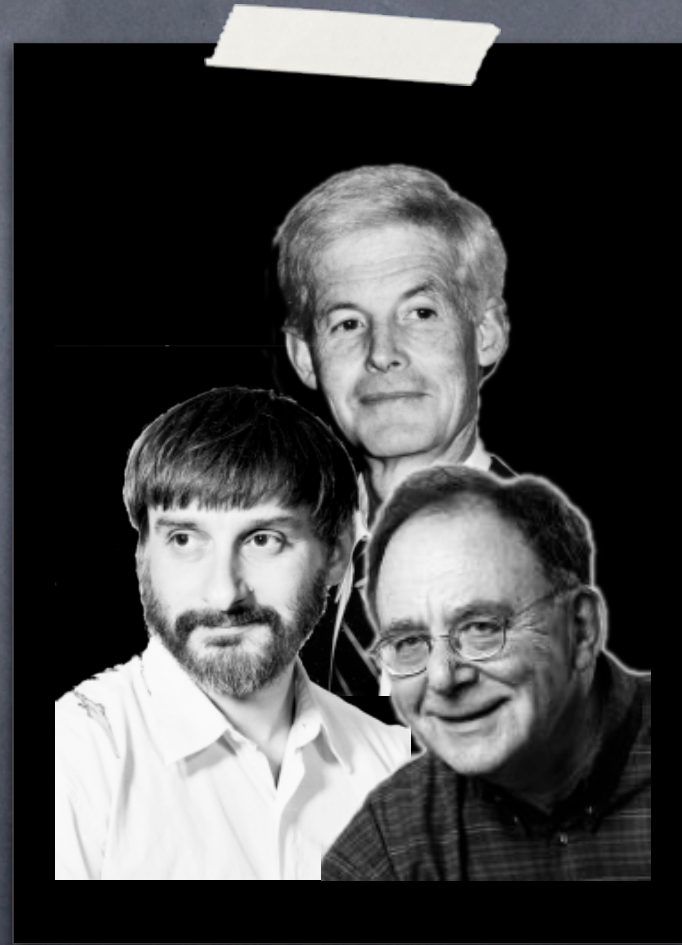
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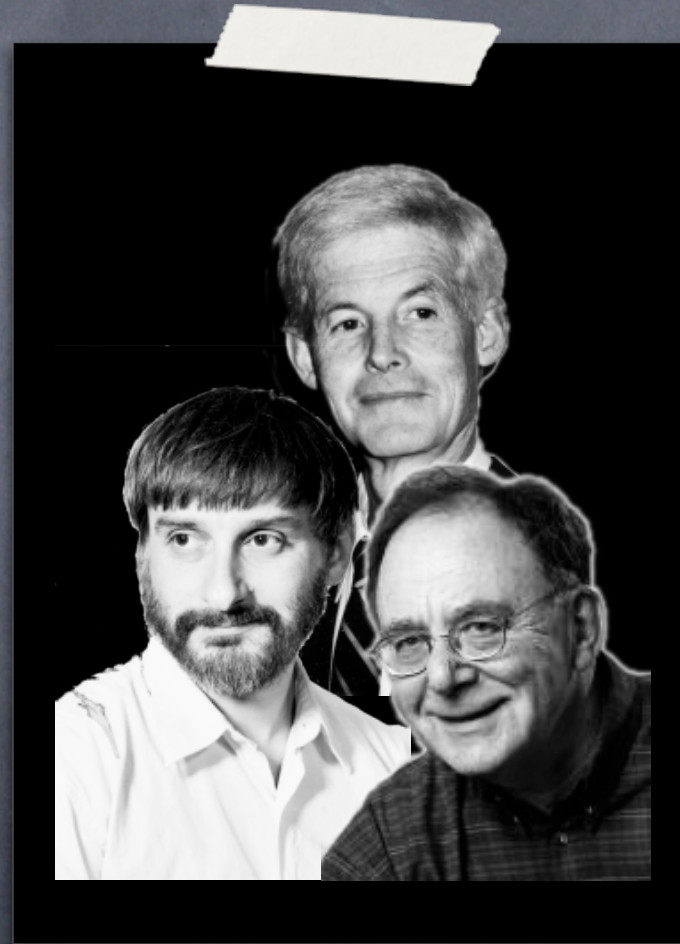
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 - L_2 may be way harder

Cook, Karp, Levin



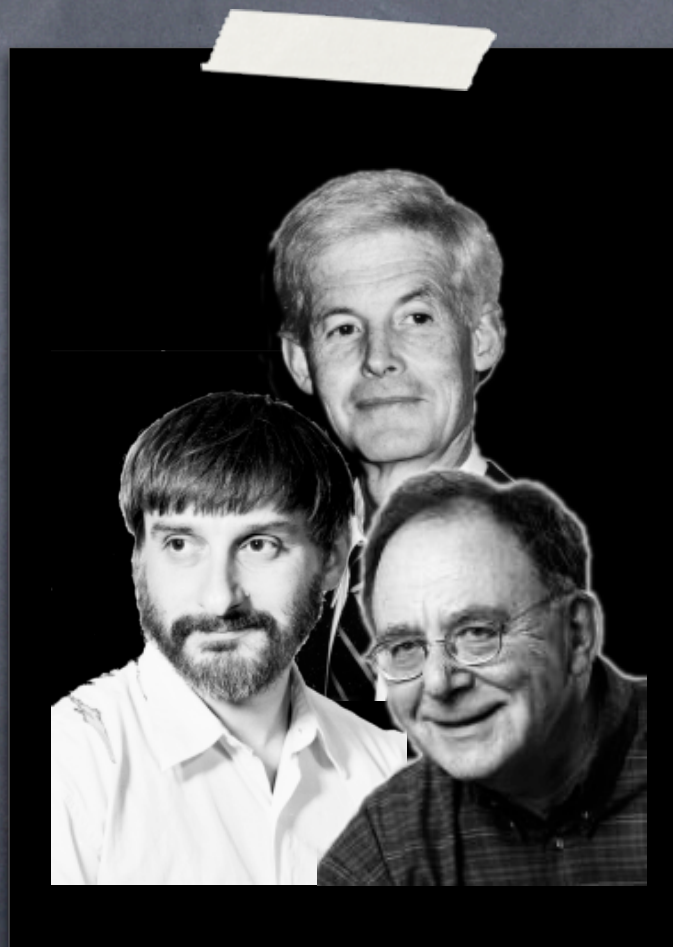
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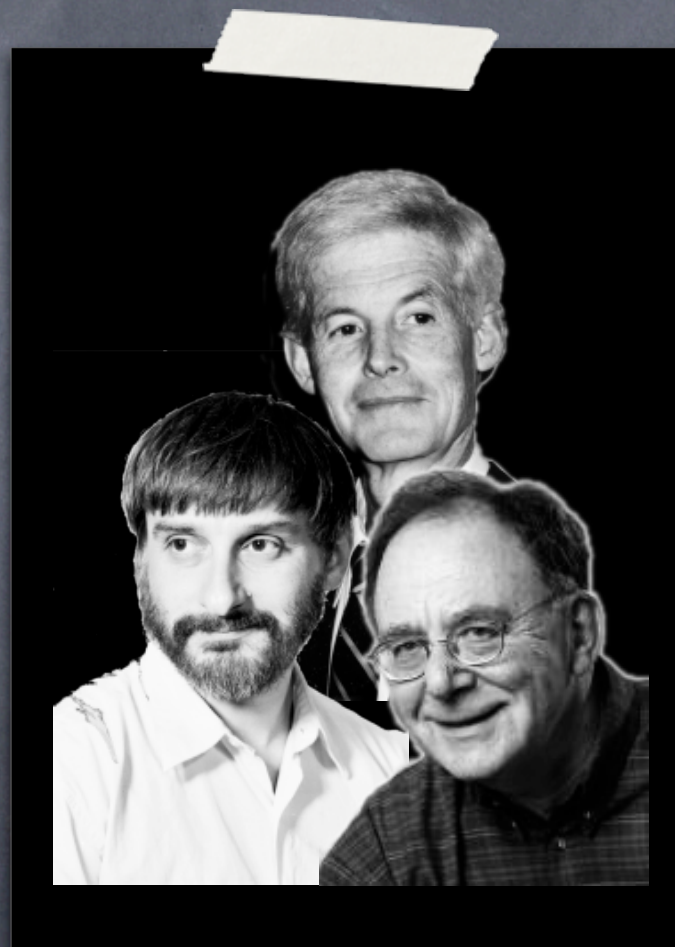
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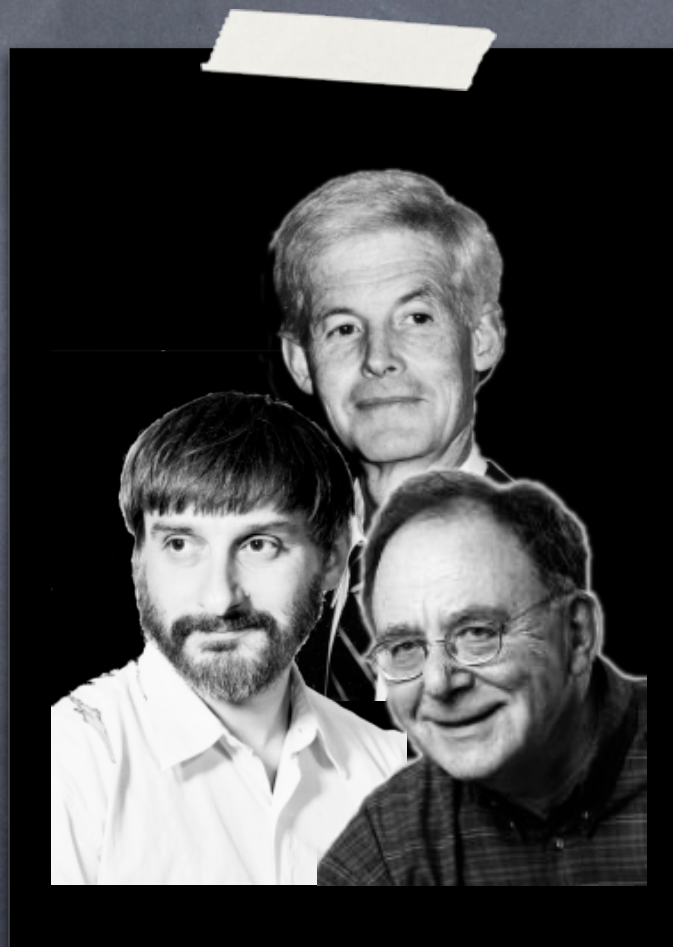
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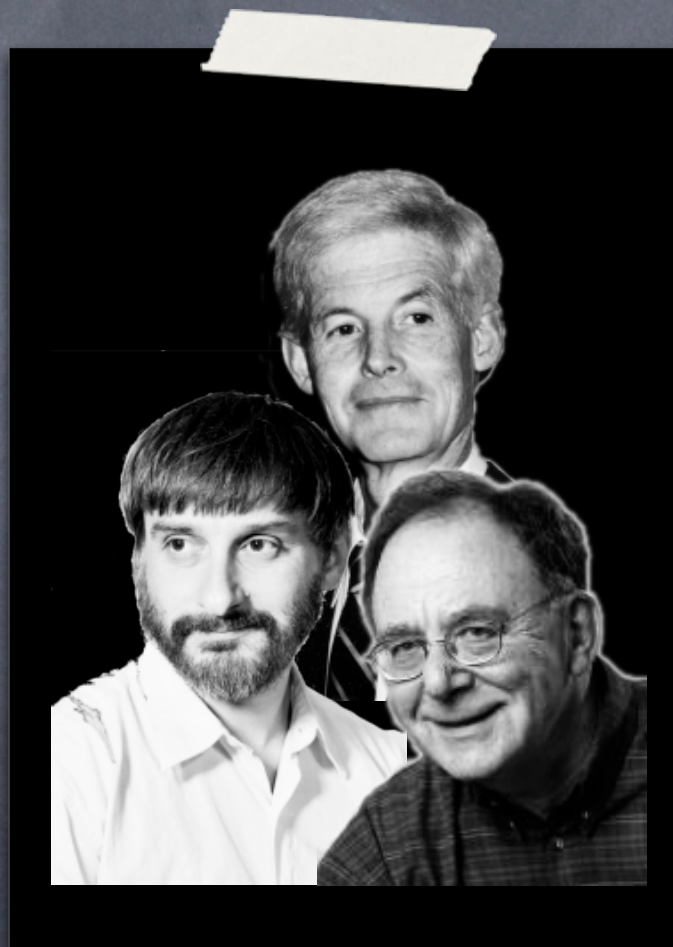
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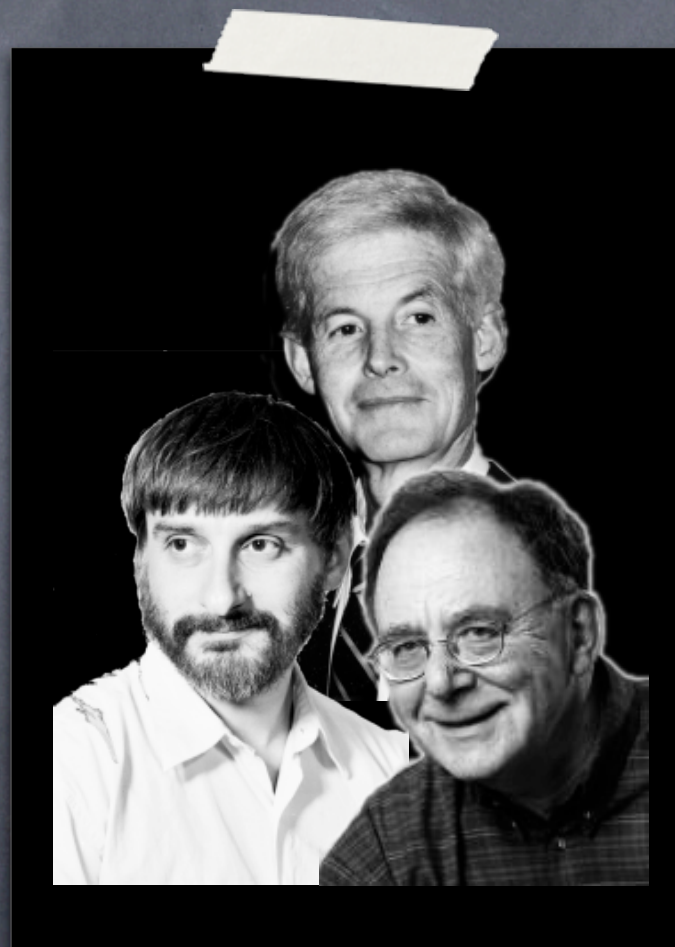
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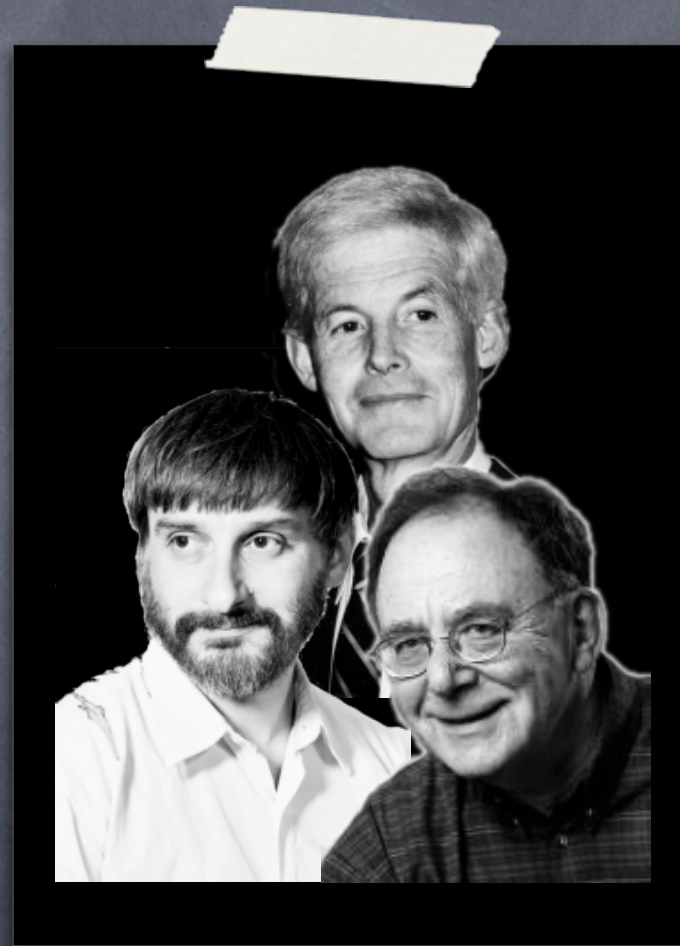
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 - Levin: Karp + witnesses easily transformed back and forth
 - Parsimonious: Karp + number of witnesses doesn't change



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- A language L is **NP-Complete** if it is NP-Hard and is in NP
 - To efficiently solve all problems in NP, you need to efficiently solve L and nothing more

A simple NPC language

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- $TMSAT = \{ (M, z, 1^n, 1^t) \mid \exists w, |w| < n, \text{ s.t. TM represented by } M \text{ accepts } (z, w) \text{ within time } t \}$

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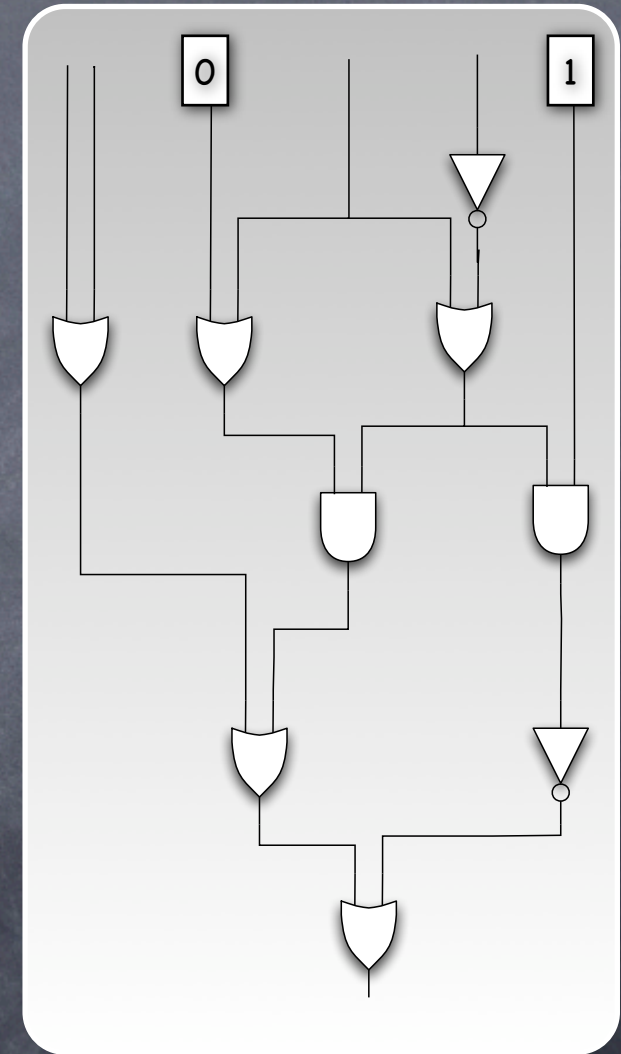
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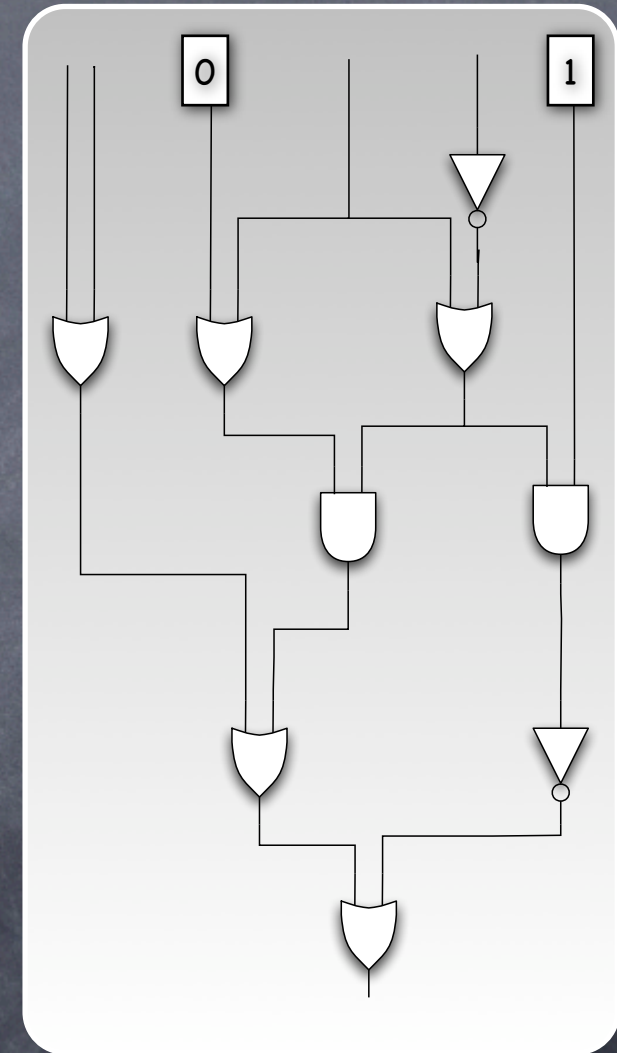
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- Any "natural" NPC language?

Boolean Circuits



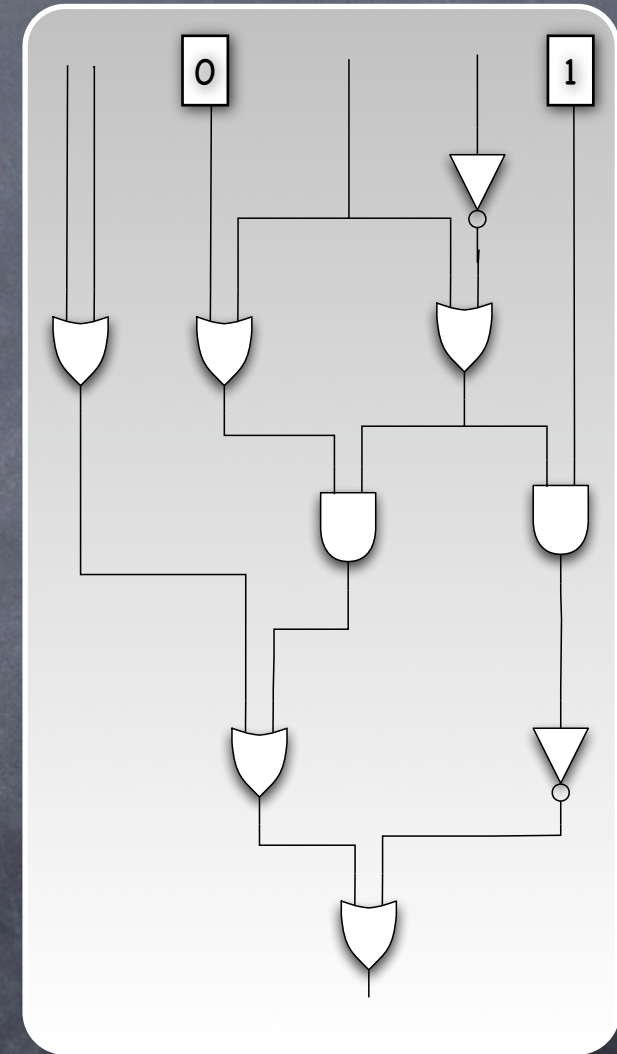
Boolean Circuits

- Boolean valued wires, AND, OR, NOT, CONST gates, inputs, output, directed acyclic graph



Boolean Circuits

- Boolean valued wires, AND, OR, NOT, CONST gates, inputs, output, directed acyclic graph
 - Circuit evaluation **CKT-VAL**: given (ckt,inputs) find ckt's boolean output value
 - Can be done very efficiently: CKT-VAL is in P
- **CKT-SAT**: given ckt, is there a "satisfying" input (output=1). In NP.



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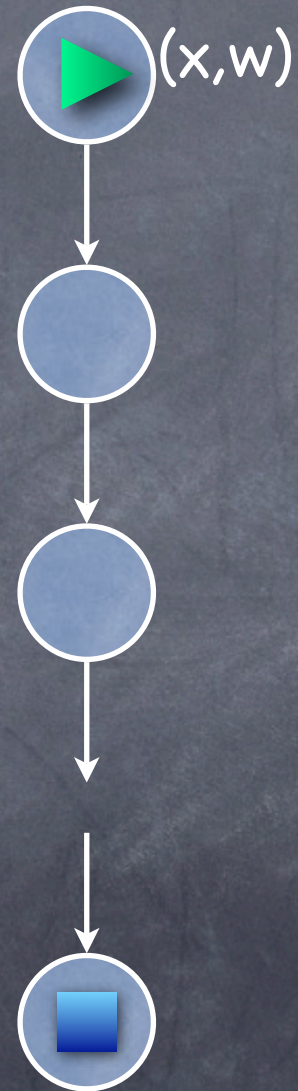
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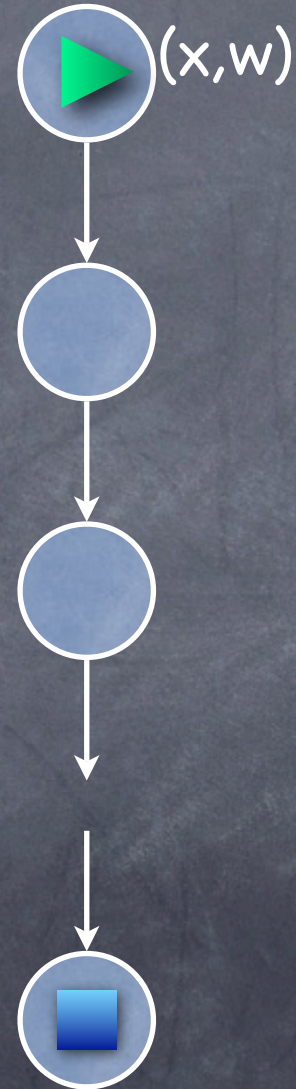
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 - Ensure reduction is poly-time

TM to Circuit



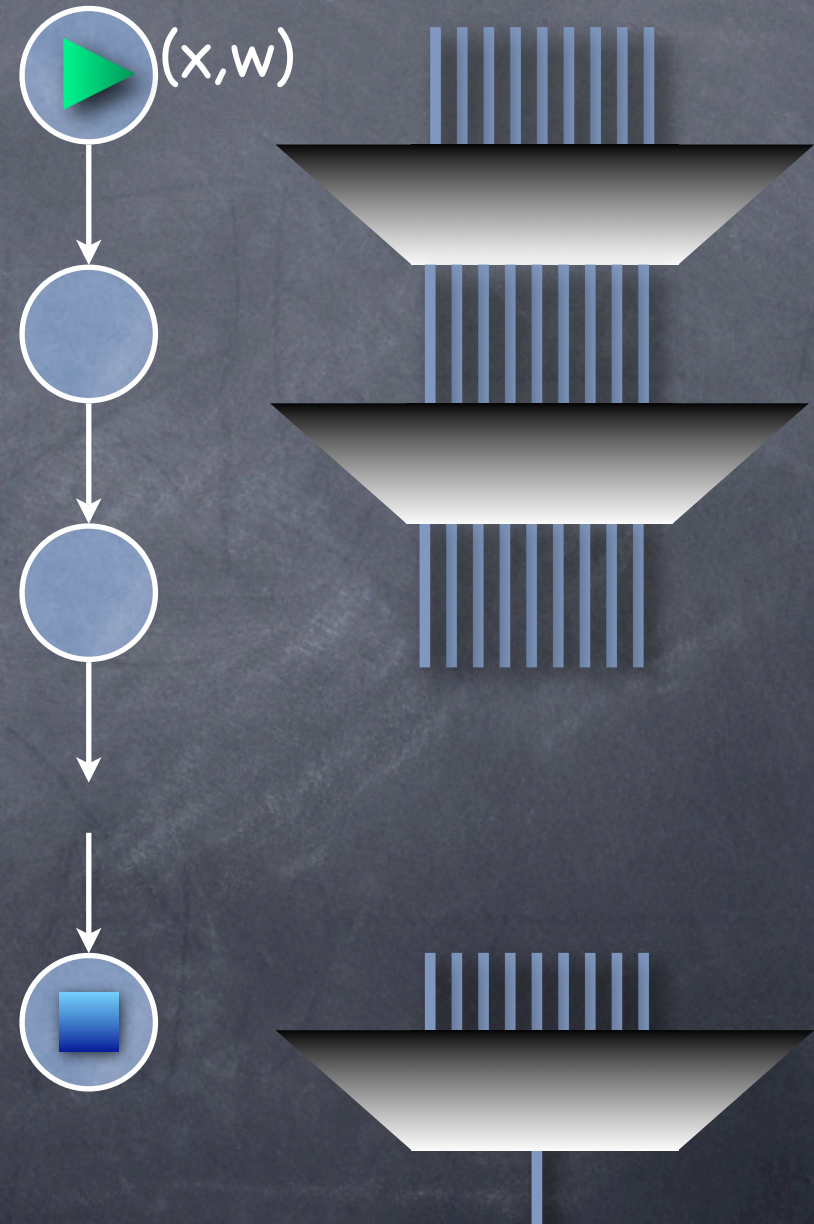
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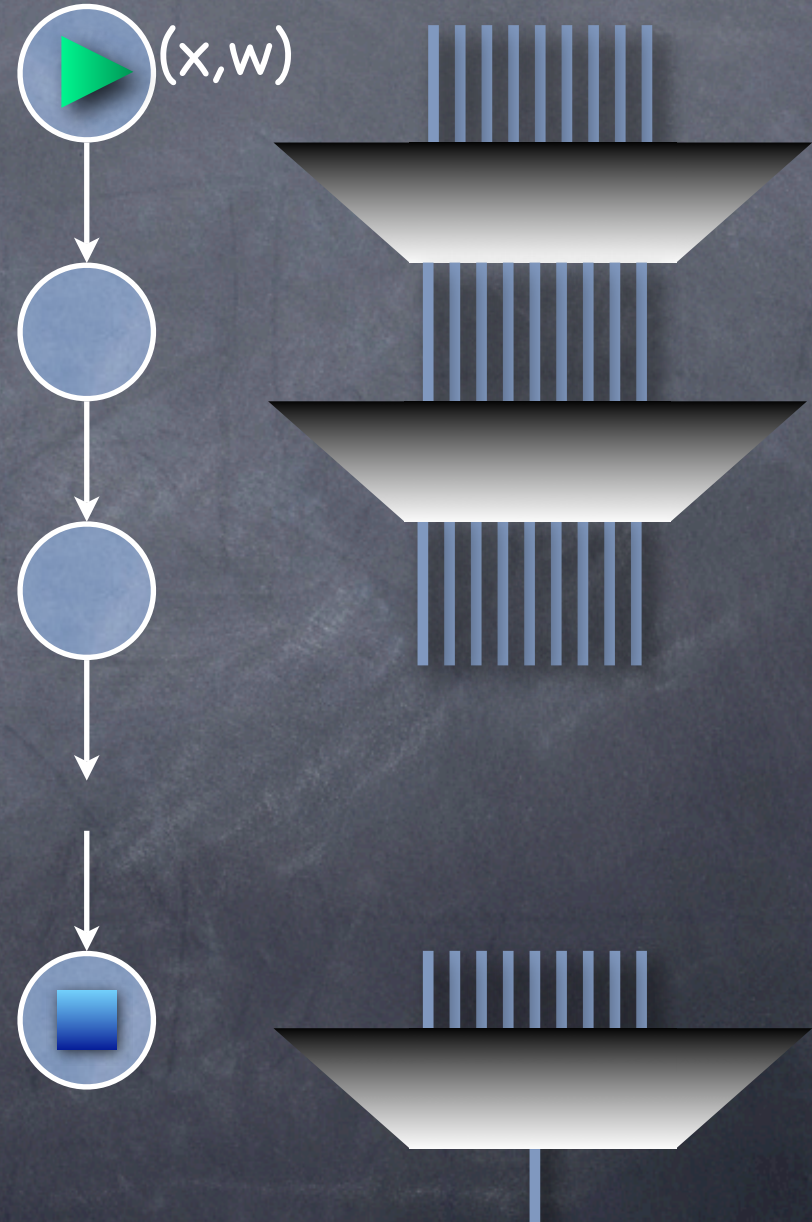
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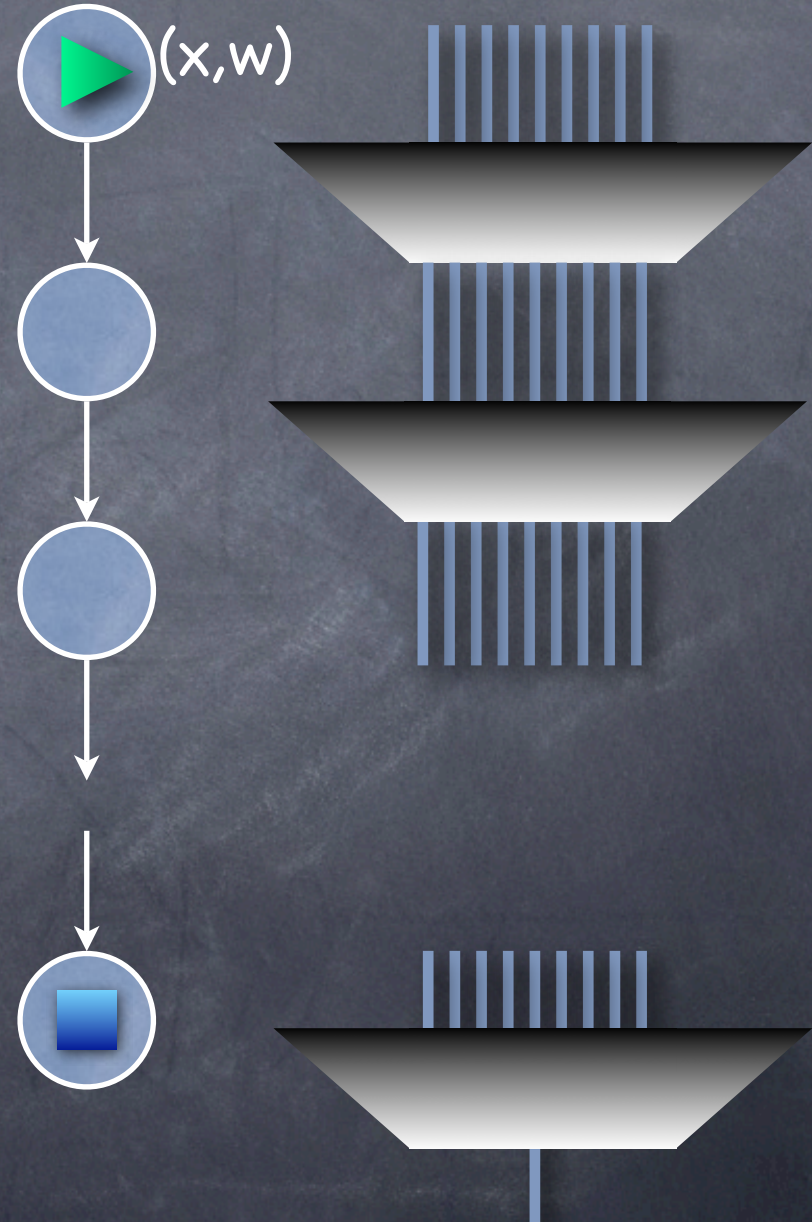
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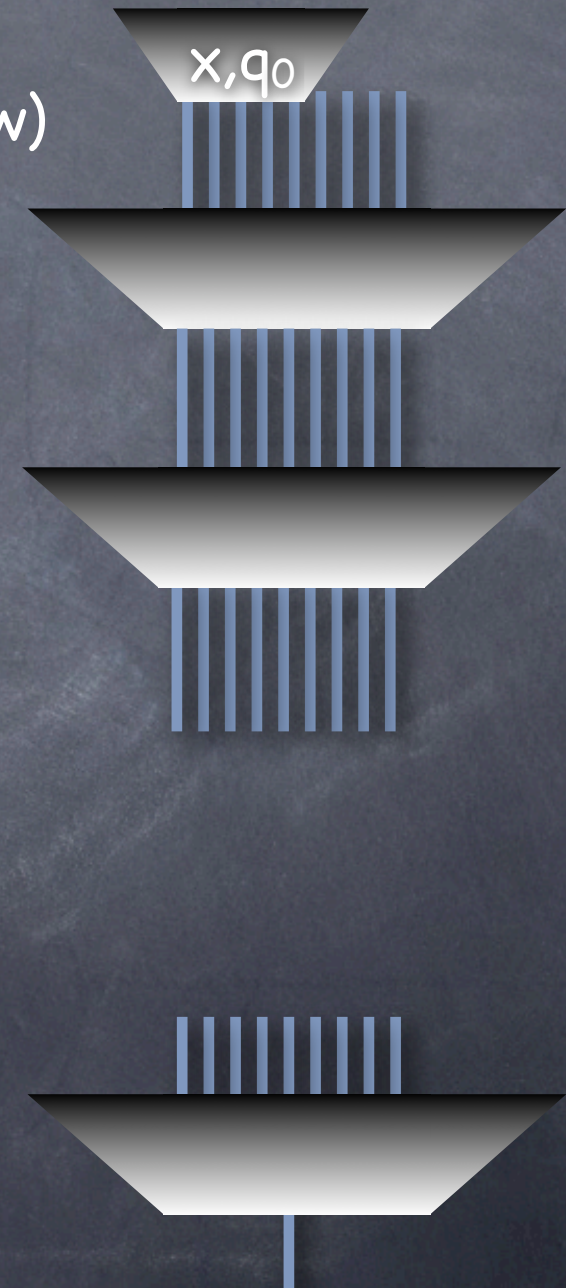
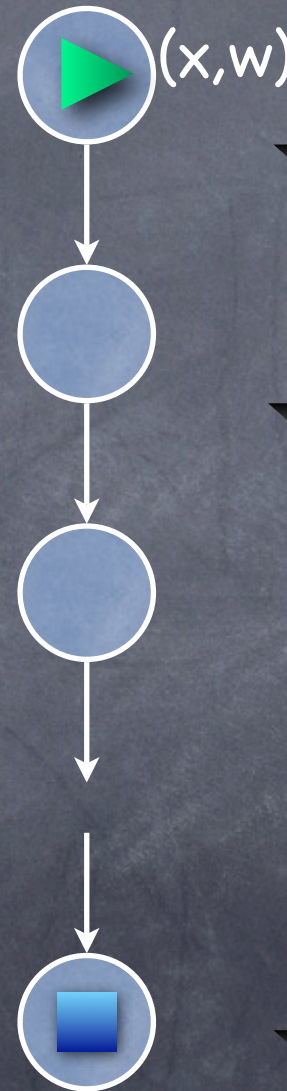
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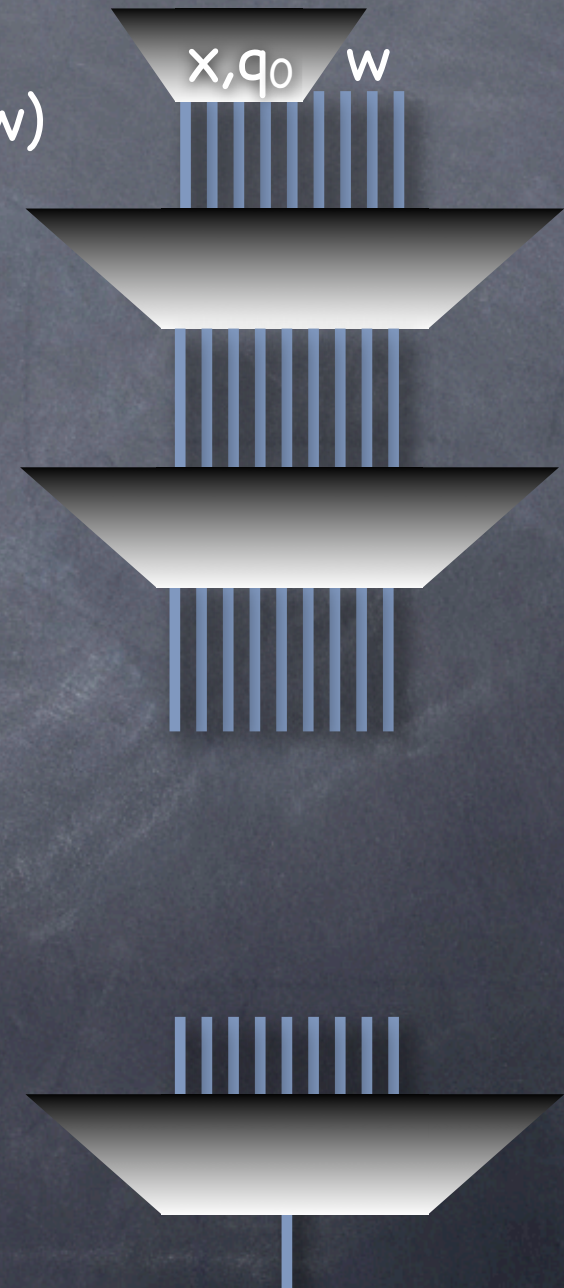
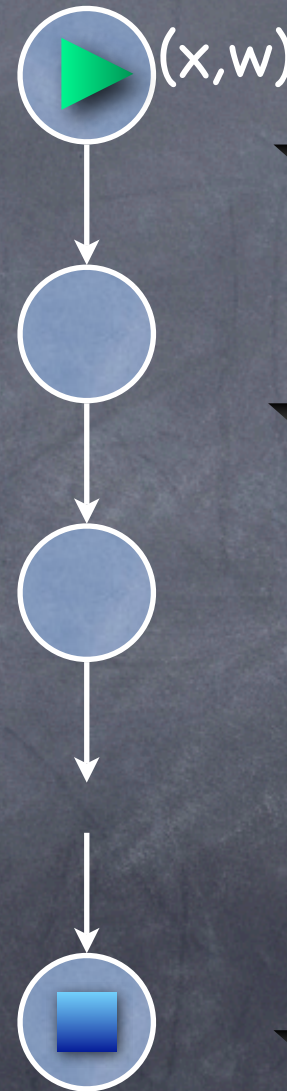
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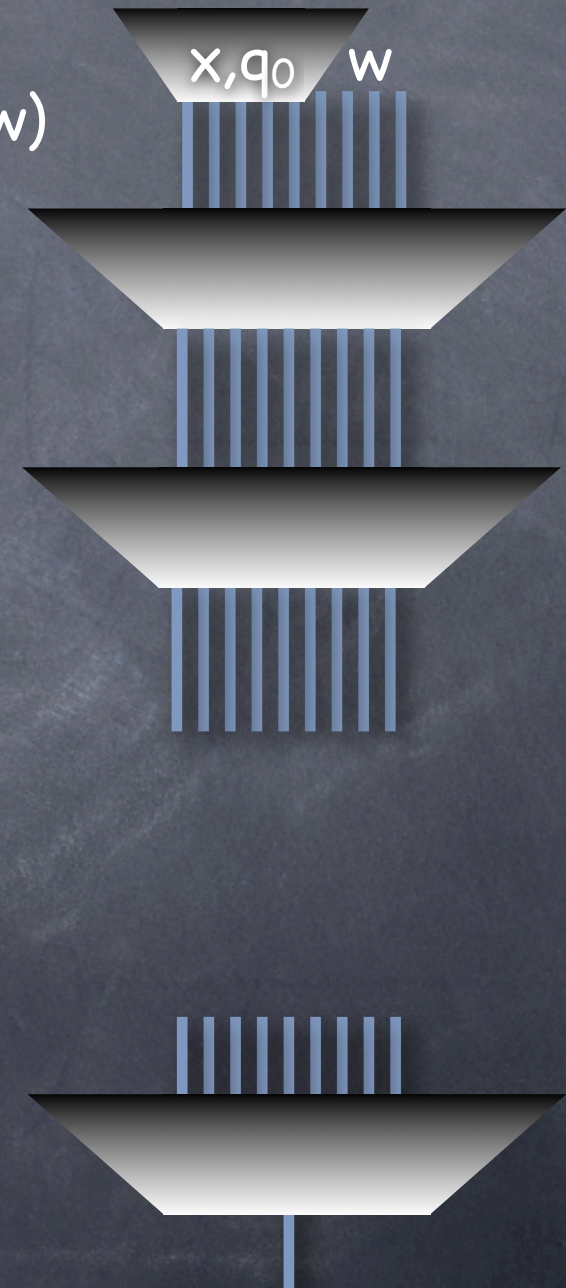
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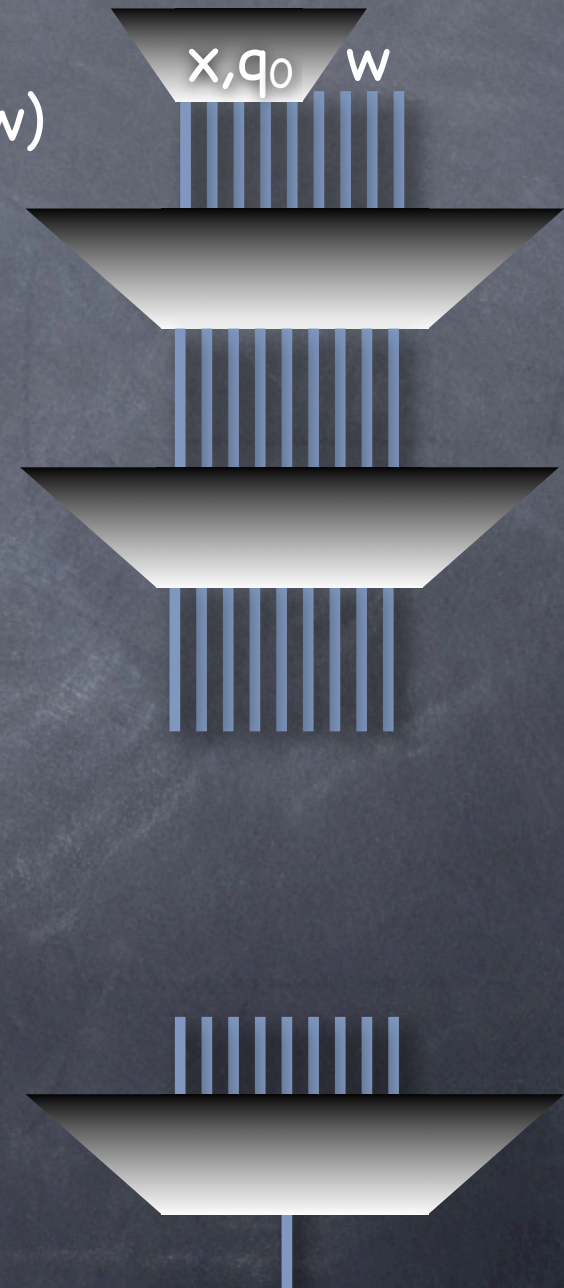
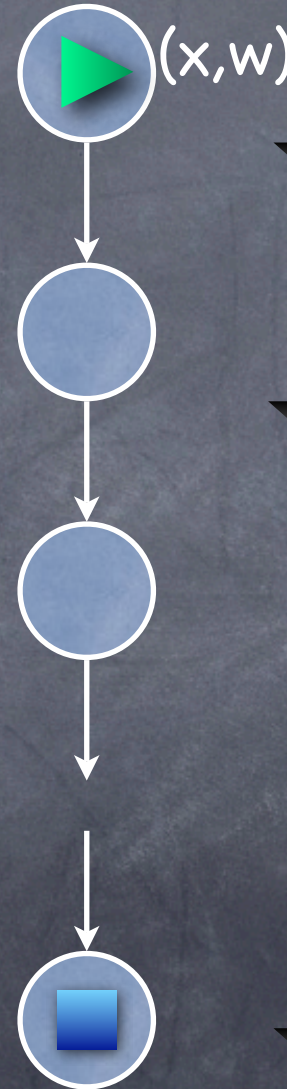
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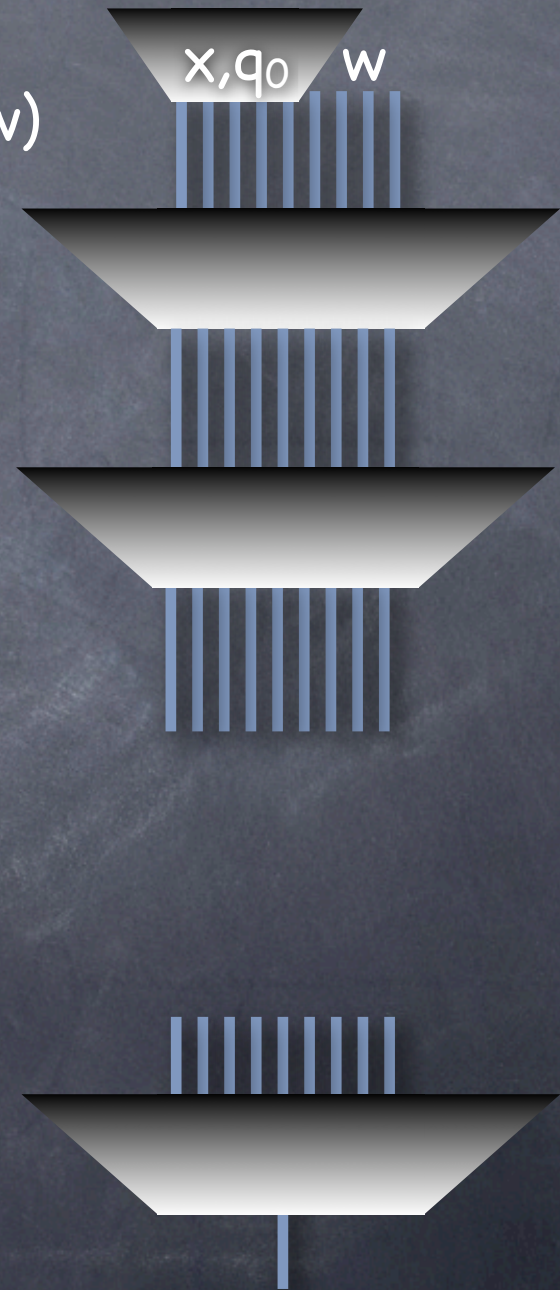


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- Circuit size = $O(T^2)$

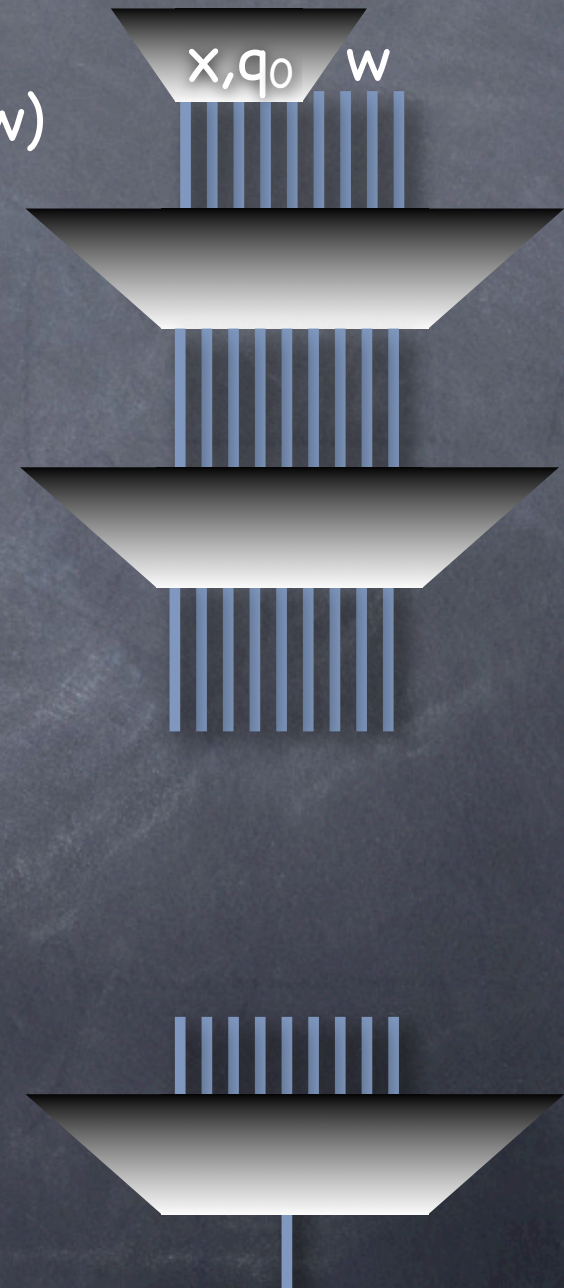


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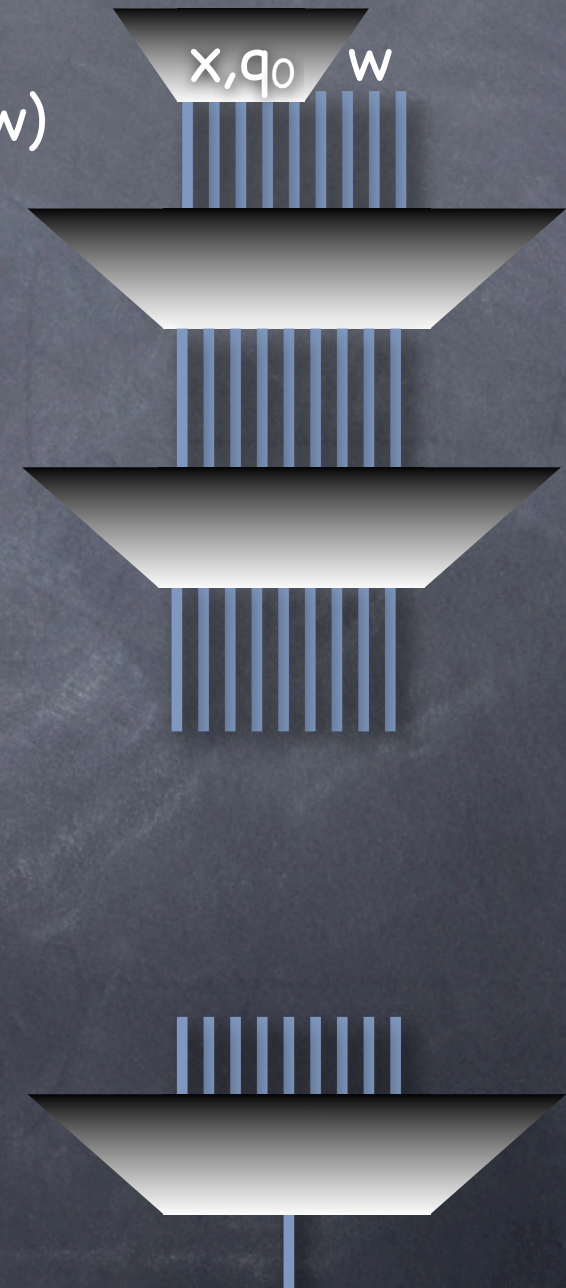
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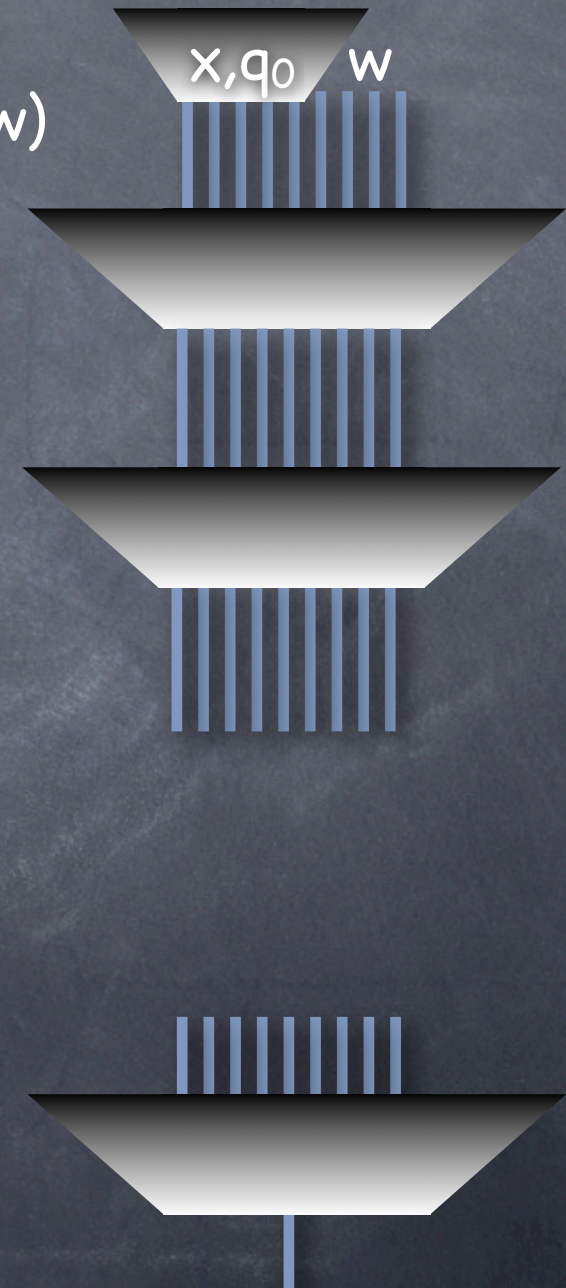
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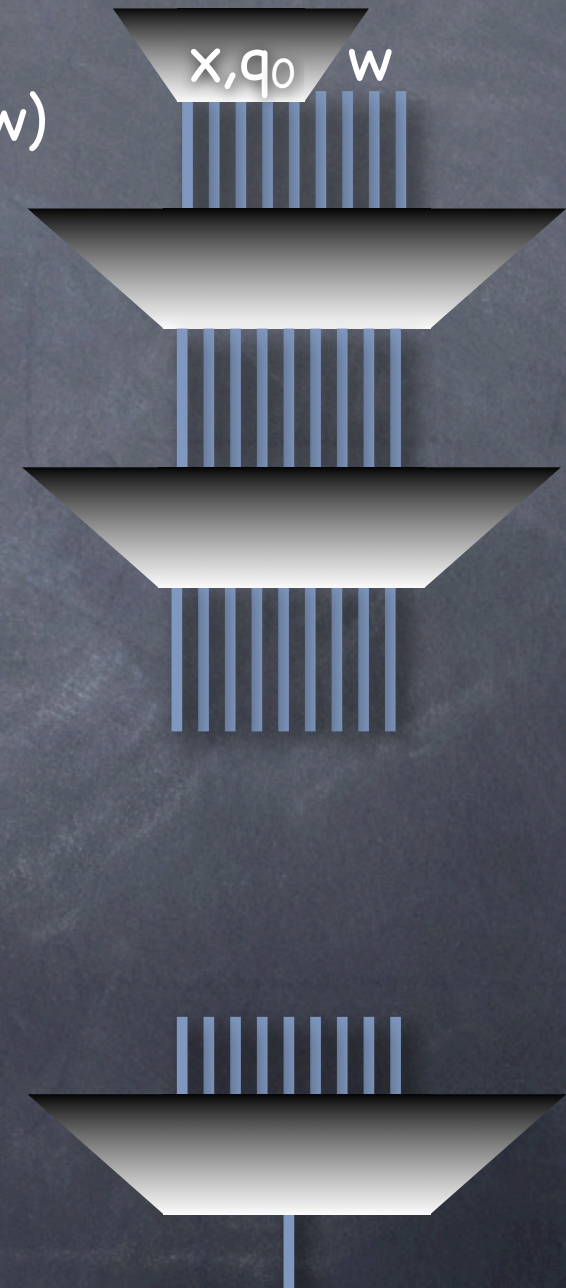
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 - CKT-SAT is NP-complete



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 - If $L \leq_p L_1$ and $L_1 \leq_p L_2$, then $L \leq_p L_2$

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• and  $z: (z \Rightarrow x \vee y), (\neg z \Rightarrow \neg x), (\neg z \Rightarrow \neg y)$.

$SAT \leq_p 3SAT$

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- Previous reduction was to 3SAT, so 3SAT is NP-complete. And SAT is in NP. So $\text{SAT} \leq_p \text{3SAT}$.

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- Reduction not parsimonious (can you make it? [Exercise])

$3\text{SAT} \leq_p \text{CLIQUE}$

3SAT \leq_p CLIQUE

- Clauses \rightarrow Graph

3SAT \leq_p CLIQUE

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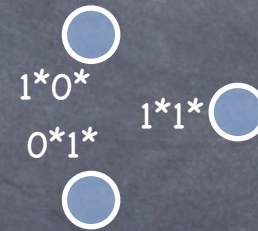
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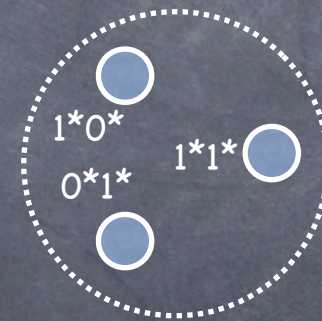
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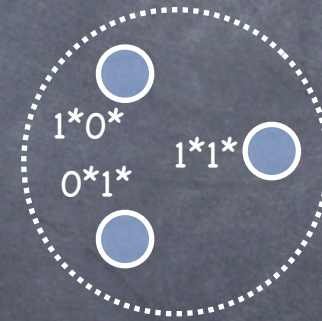
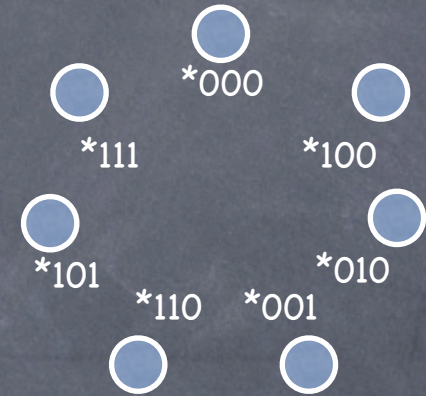
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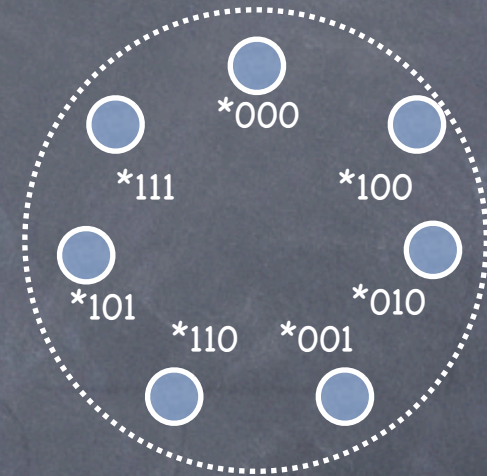


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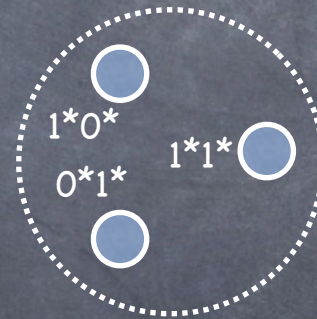
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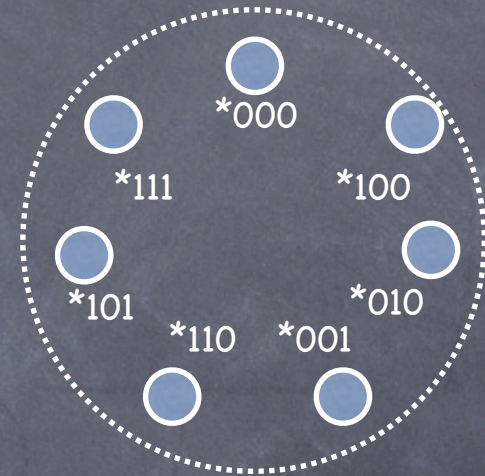
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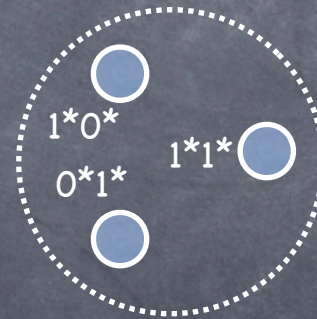
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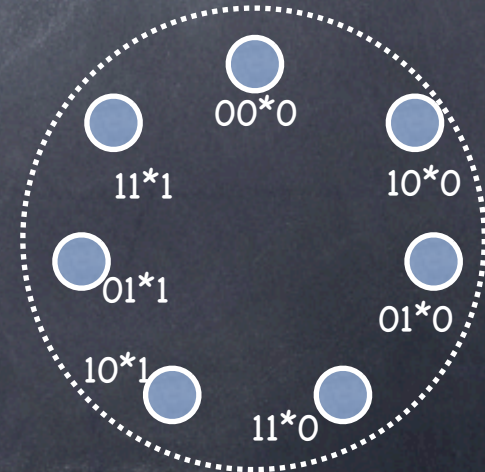
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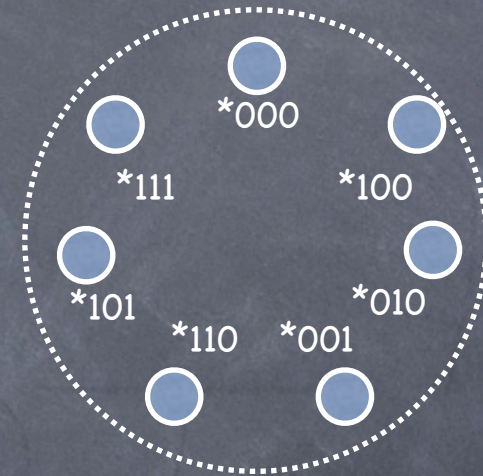
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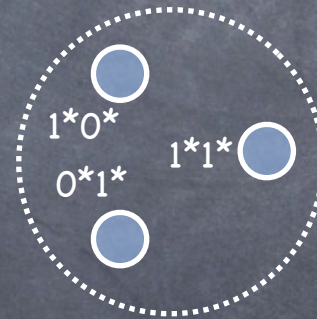
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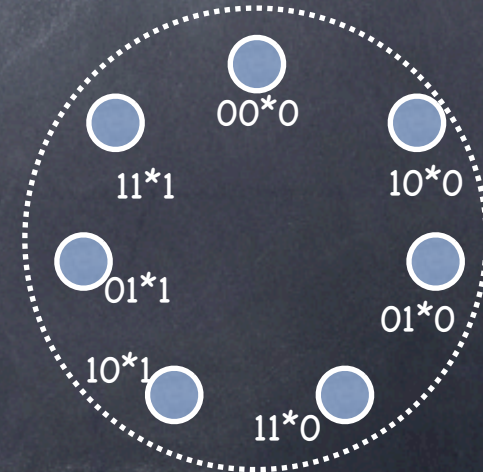
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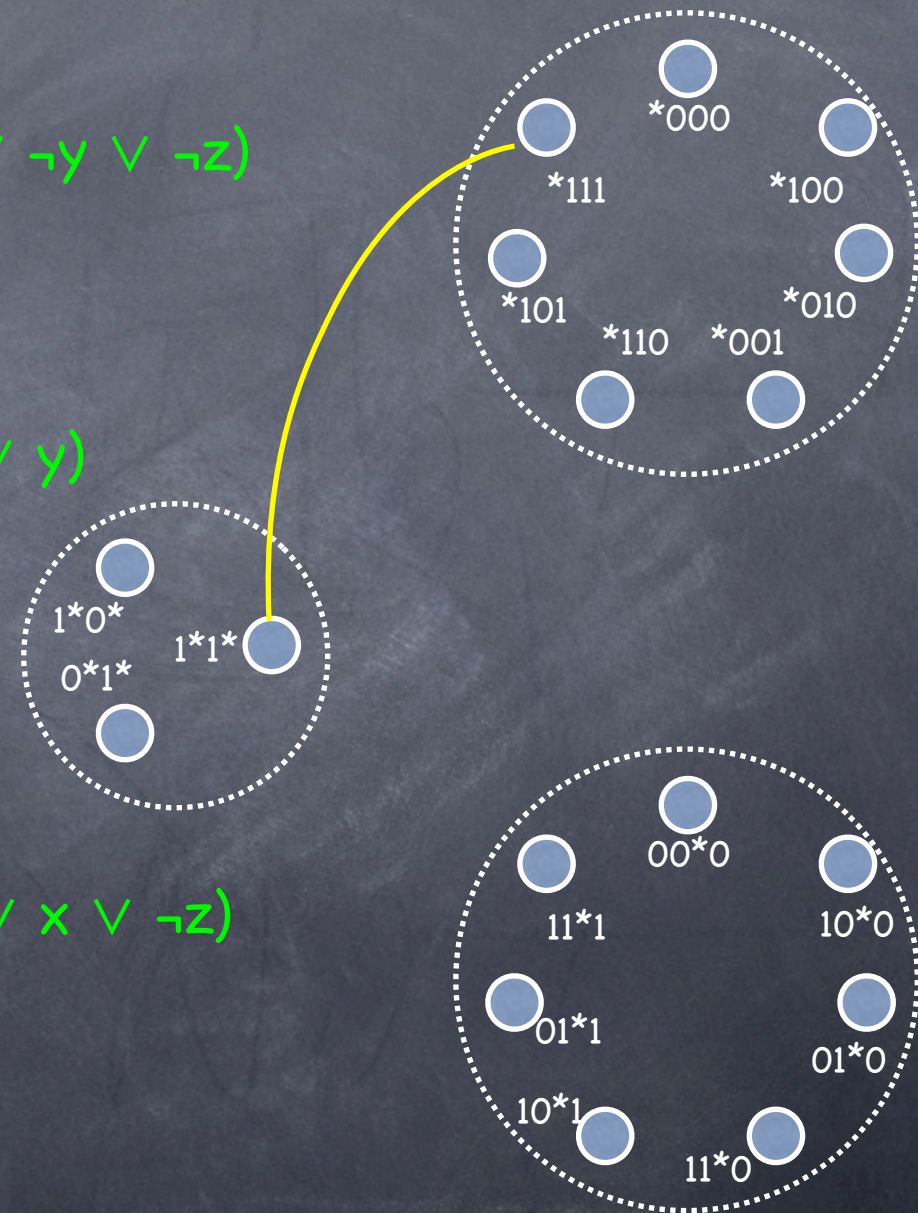
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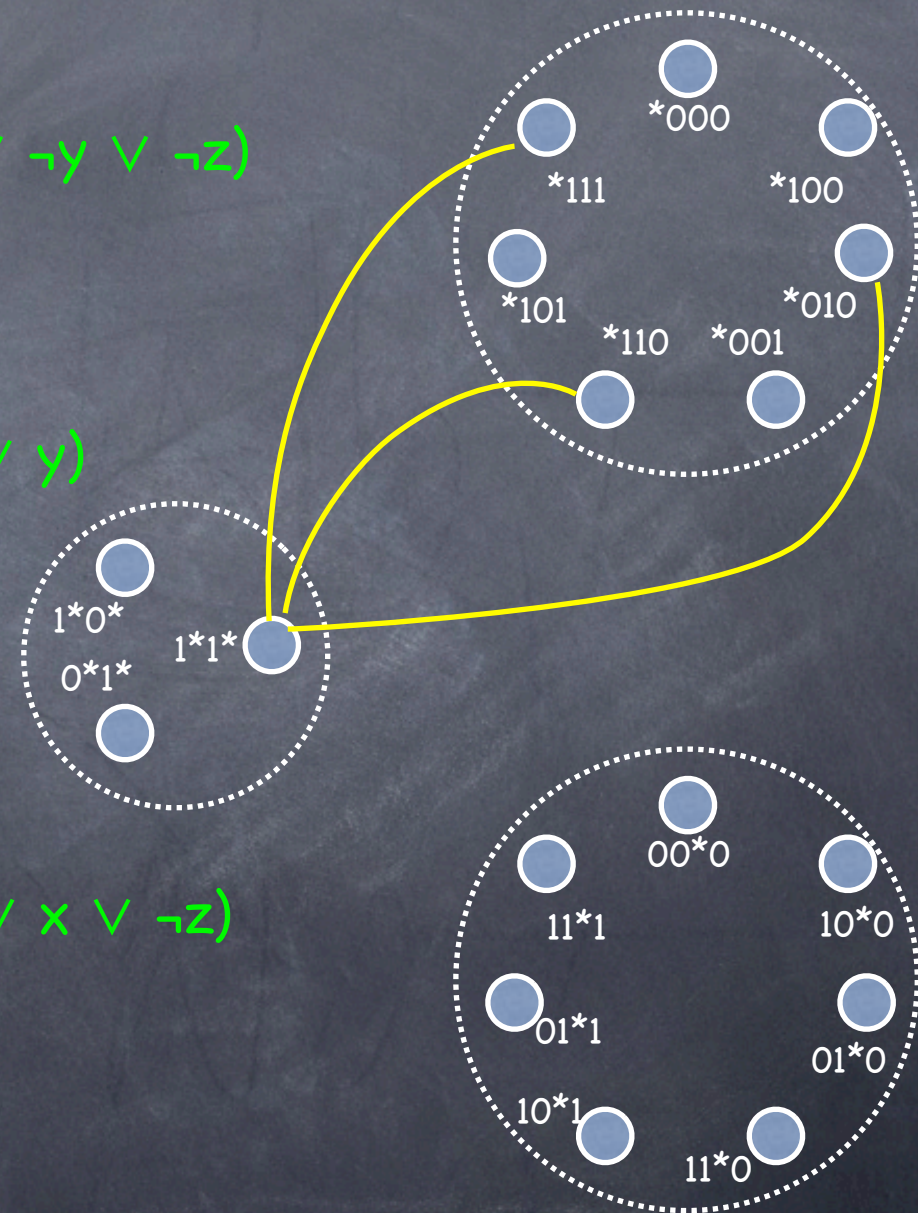
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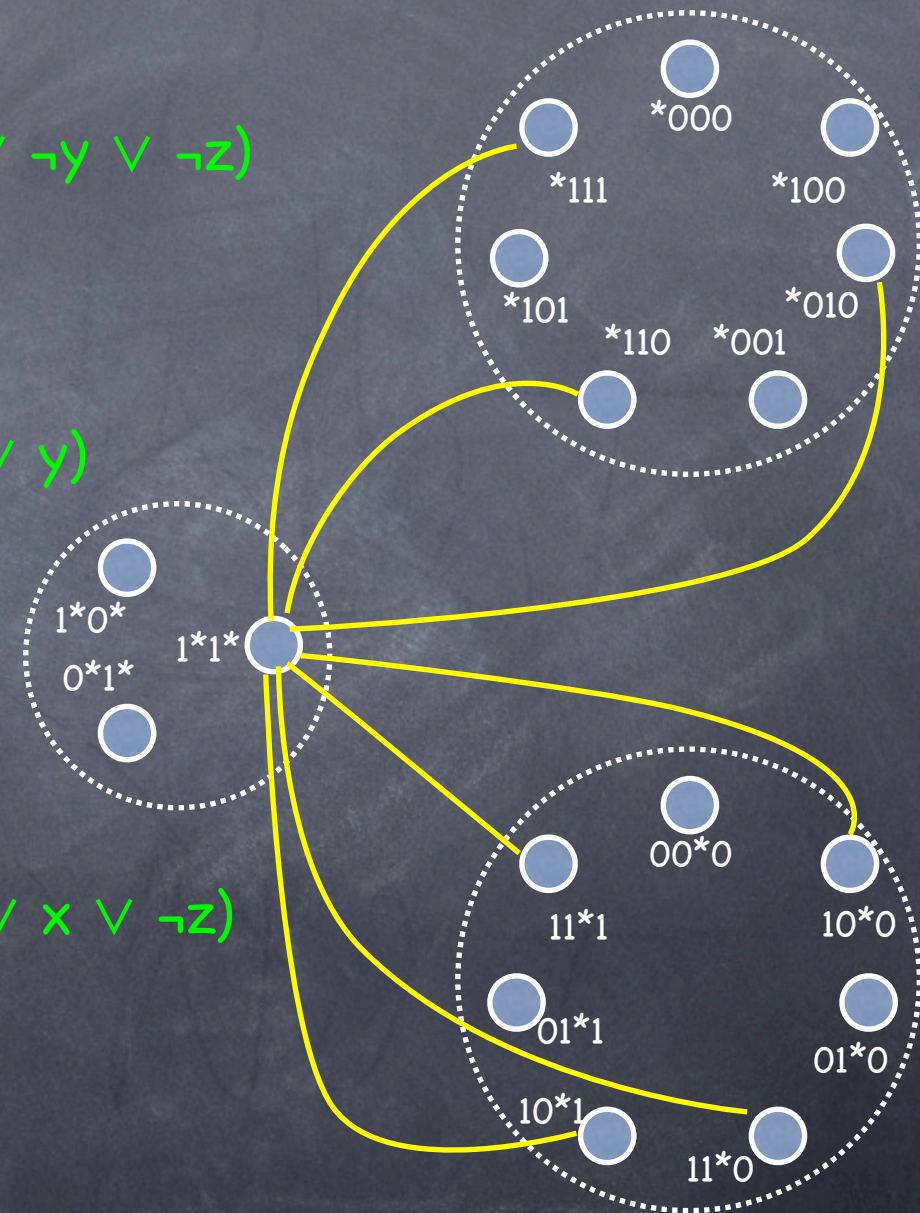
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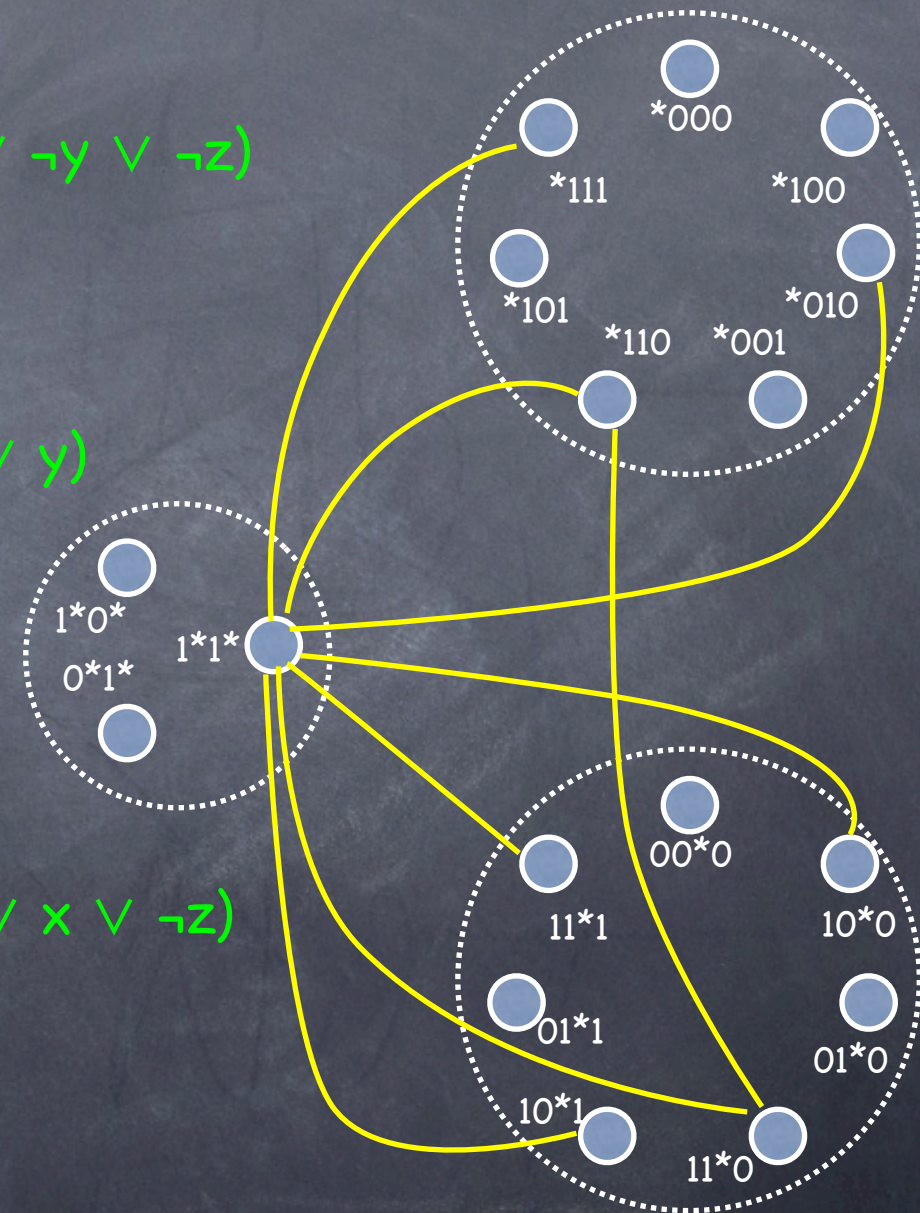
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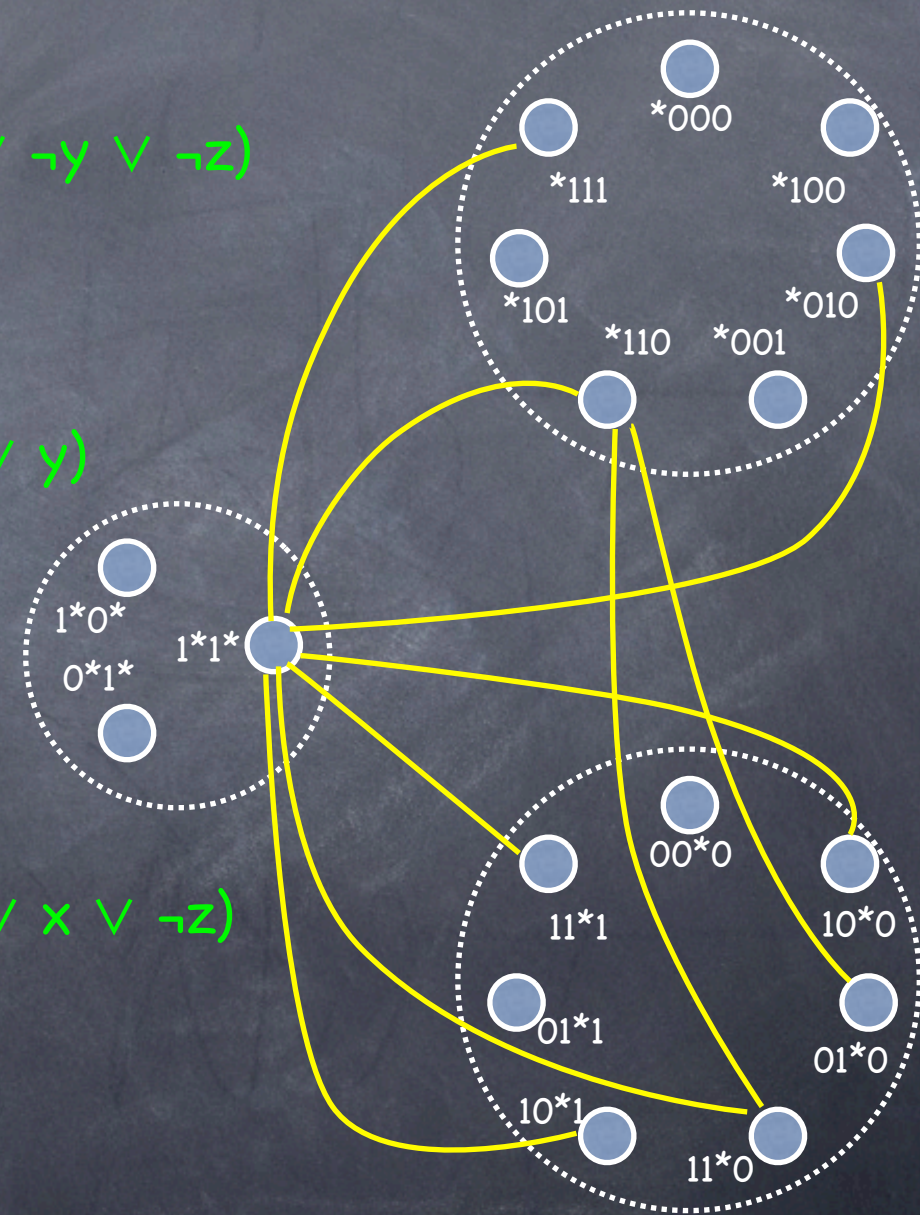
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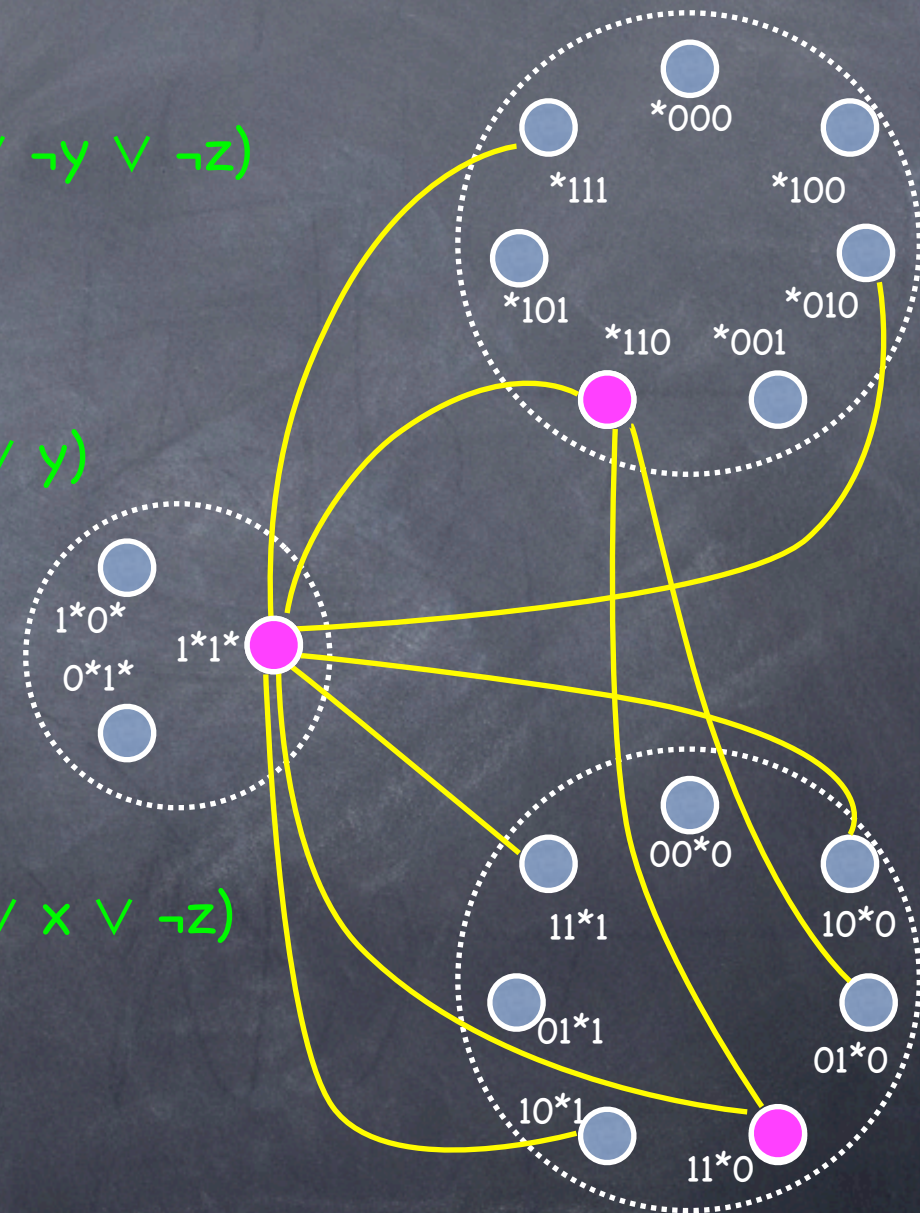
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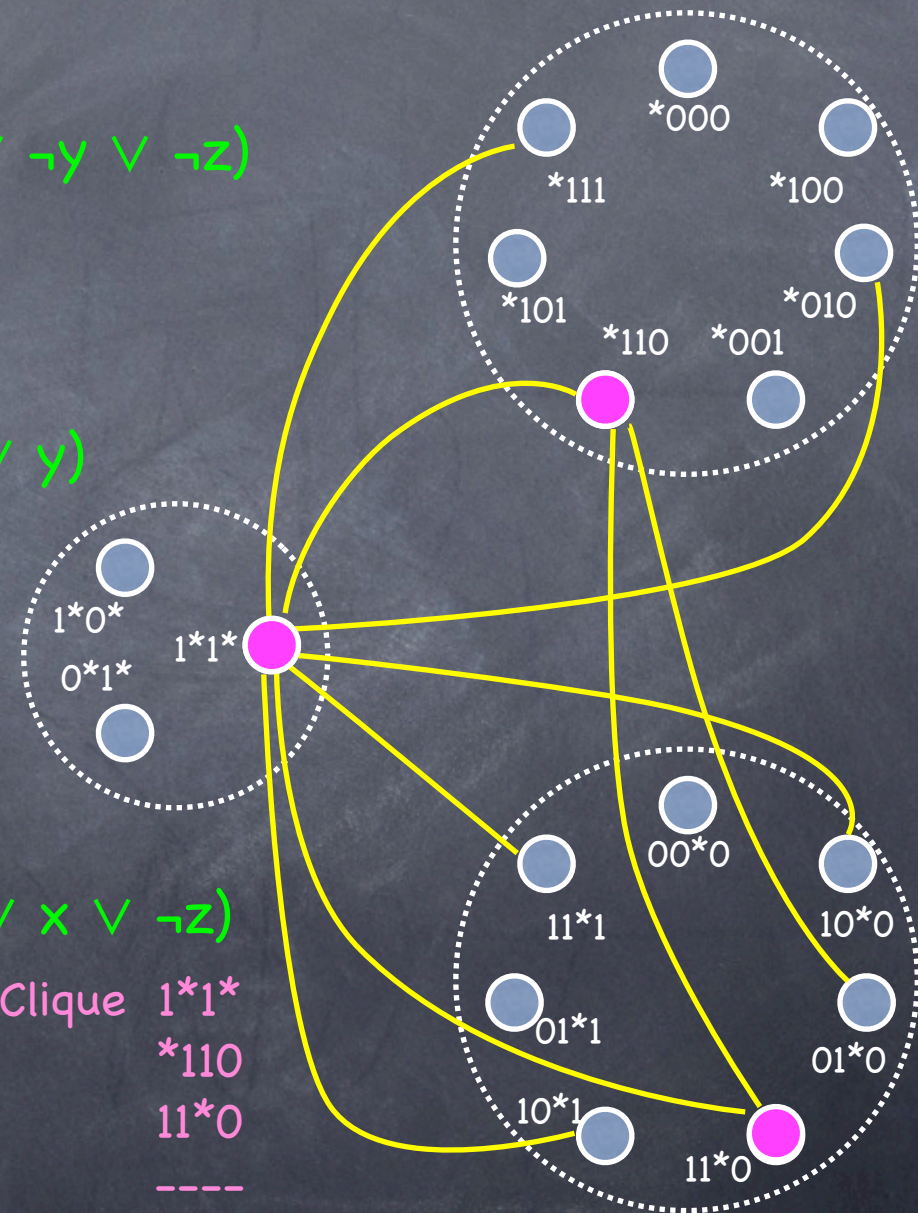
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3-Clique 1^*1^*

$*110$

11^*0

sat assignment 1110



INDEP-SET and VERTEX-COVER

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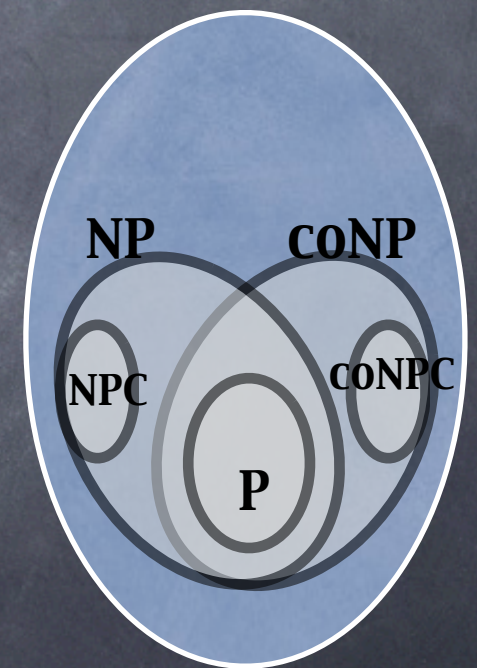
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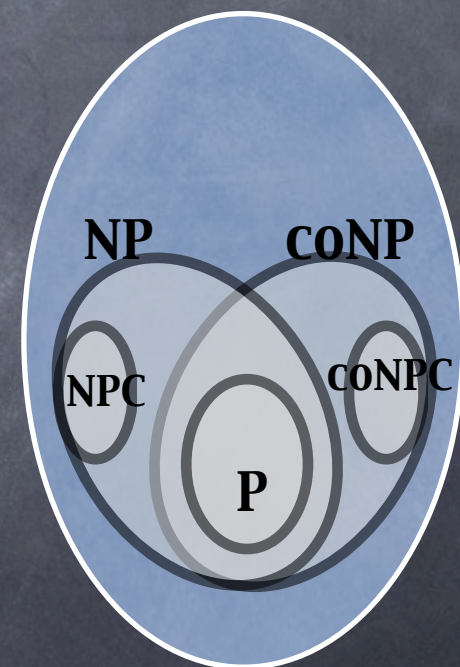
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NP, P, co-NP and NPC



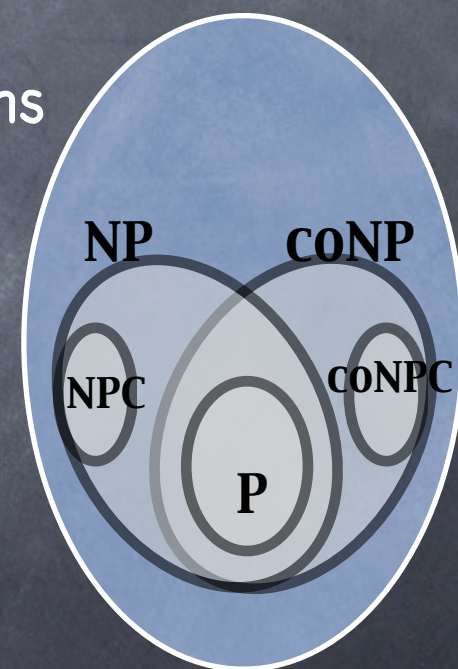
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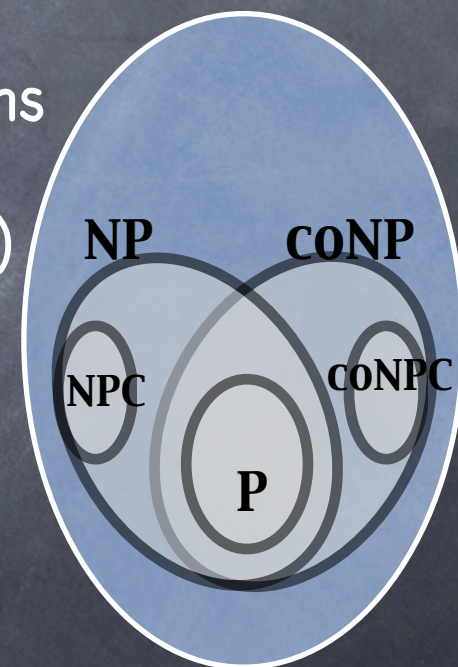
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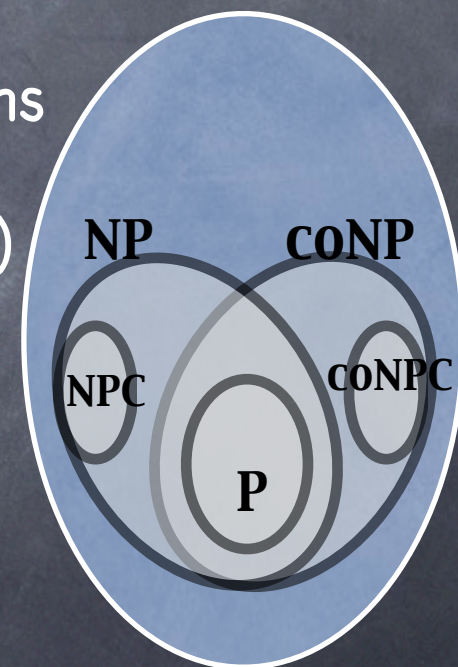
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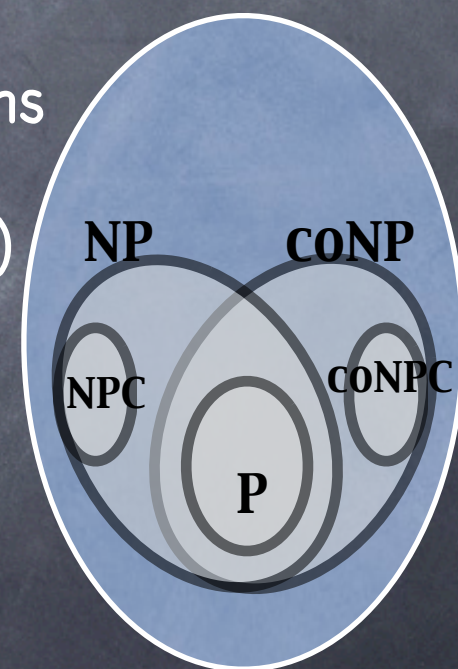
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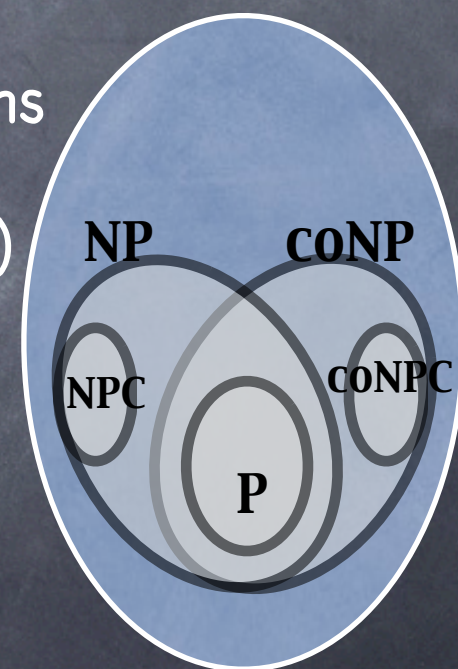
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 - Note: if L in NPC, L^c is in $co-NPC$



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