

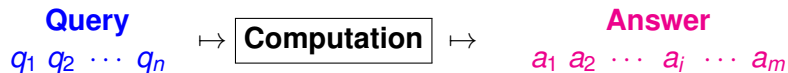
# Towards Capturing Order-Independent P

Neil Immerman

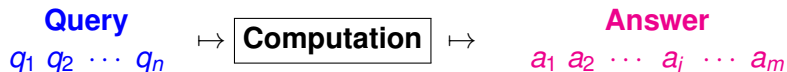
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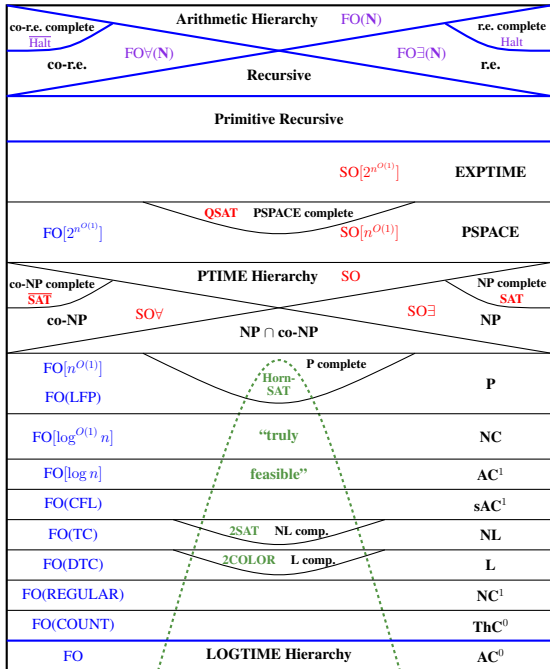


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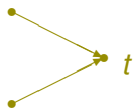
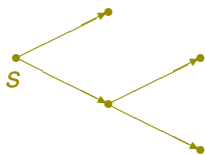
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There is a **computable isomorphism** between these two approaches.



# Inductive Definitions and Least Fixed Point

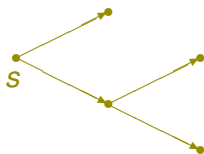
$$\text{REACH} = \{G, s, t \mid s \xrightarrow{*} t\}$$



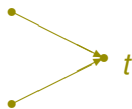


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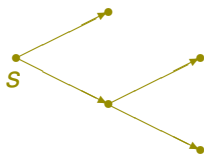
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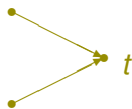
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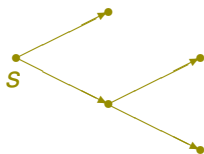


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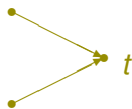
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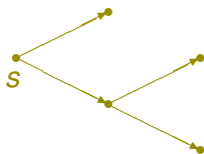
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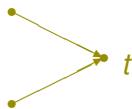
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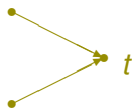
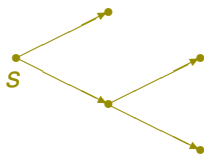
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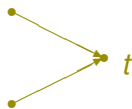
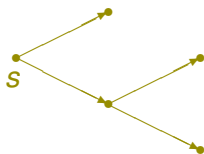
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# LFP is a Polynomial Iteration Operator

**Thm.**  $P = \text{FO}(\text{LFP}) = \text{FO}[n^{O(1)}]$

$\text{FO}[n^{O(1)}]$  means for graphs with  $n$  vertices, the formula  $\varphi_n$  expressing the property has  $n^{O(1)}$  quantifiers, but only a **fixed number** of requantified **variables**,  $x_1, \dots, x_k$ , i.e.,  $\varphi_n \in \mathcal{L}^k$ .

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**Wanted:** a language capturing Order-Independent P (**OIP**).

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How do we prove  $\text{EVEN} \notin \text{FO(wo}\leq\text{)}(\text{LFP})$  ?

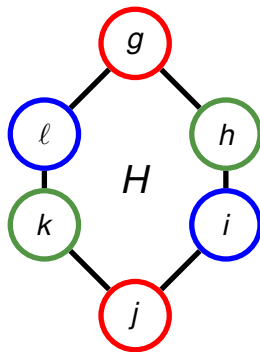
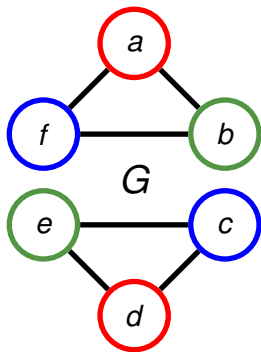
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$\mathcal{G}_m^k(G, H)$

$m$  moves,

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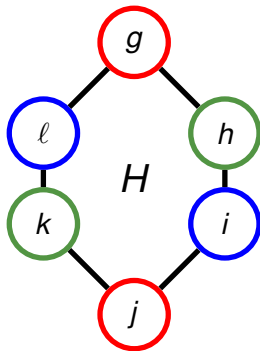
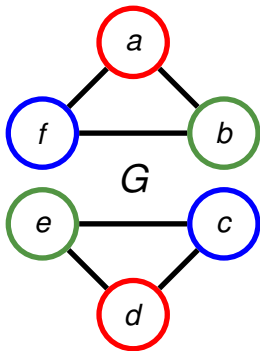
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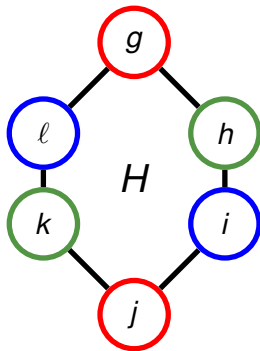
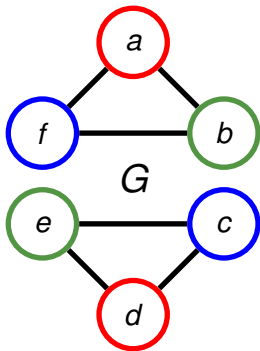
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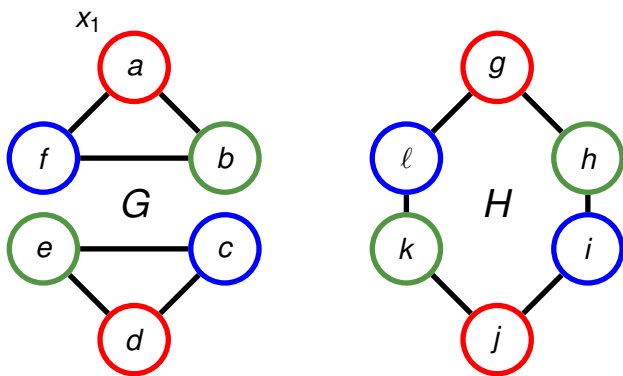
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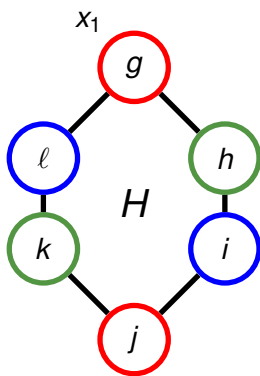
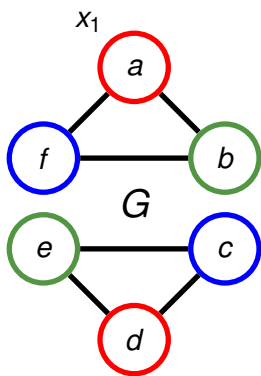
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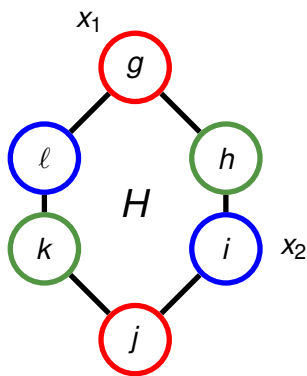
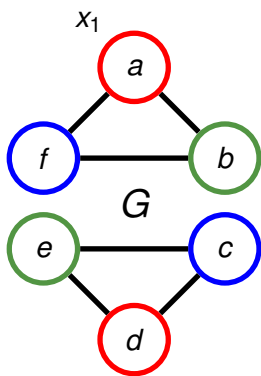
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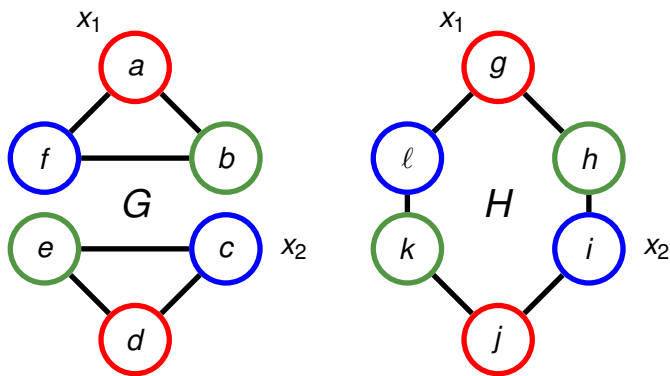




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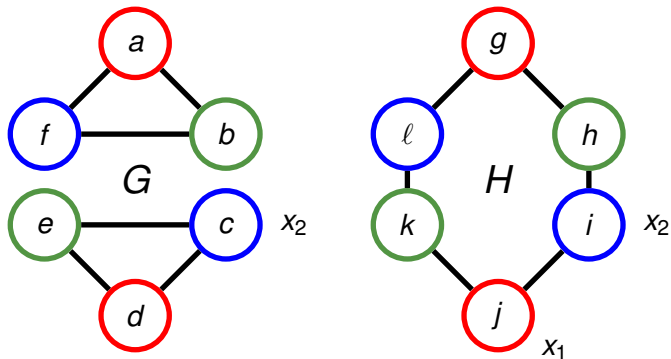
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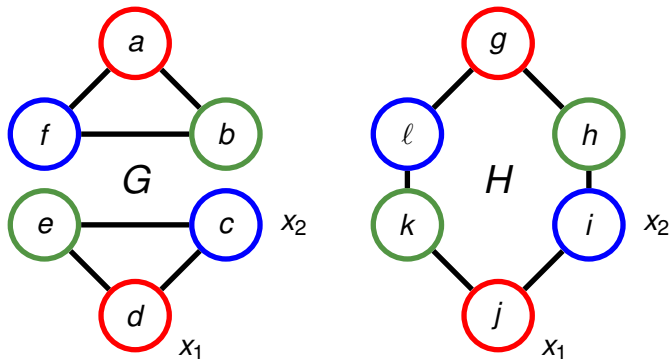
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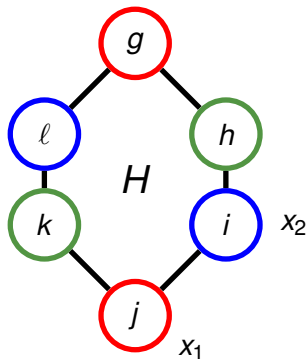
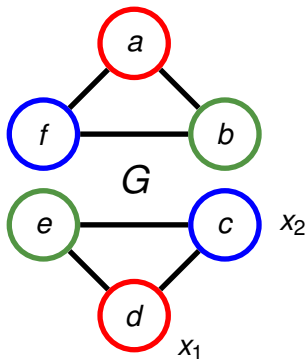


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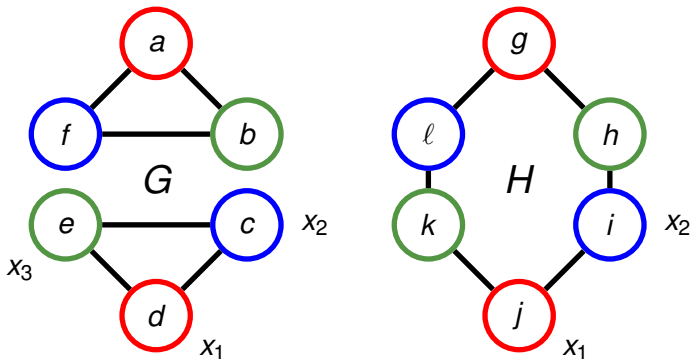


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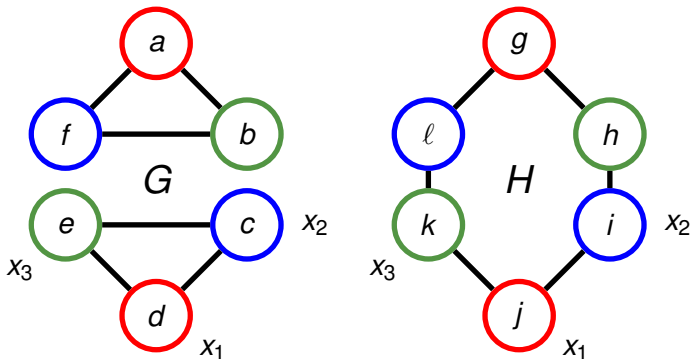


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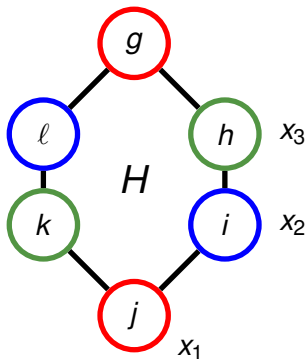
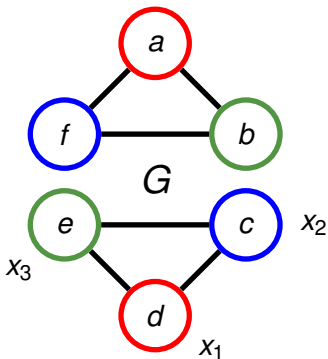


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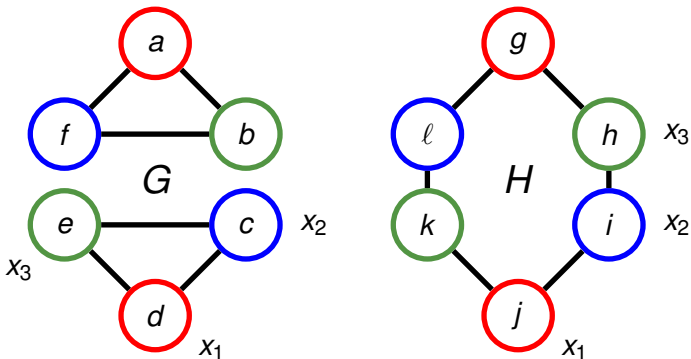
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For all  $m$ , **D** wins  $\mathcal{G}_m^2(G, H)$ ;    but **S** wins  $\mathcal{G}_3^3(G, H)$ .





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**Notation:**  $G \sim_m^k H$  means that **Delilah** has a winning strategy for  $\mathcal{G}_m^k(G, H)$ .

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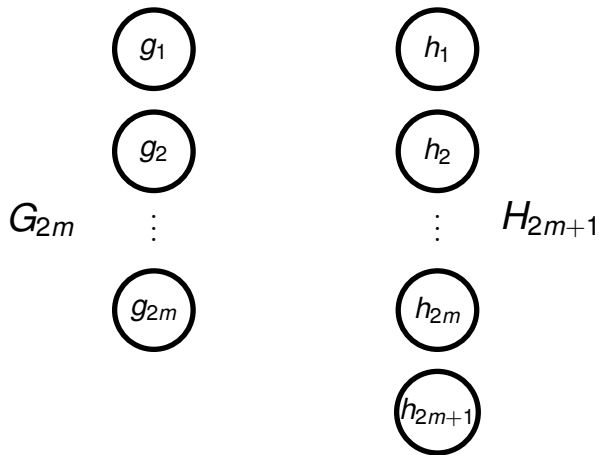
**Thm.** **D** has a winning strategy on the  $m$ -move,  $k$ -pebble game on  $G, H$  iff  $G$  and  $H$  agree on all formulas using  $k$  variables and quantifier depth  $m$ .

$$G \sim_m^k H \iff G \equiv_m^k H$$

**Thm.** **EVEN** requires  $n + 1$  variables without ordering.  
Thus **EVEN**  $\notin$  FO(wo $\leq$ )(LFP).

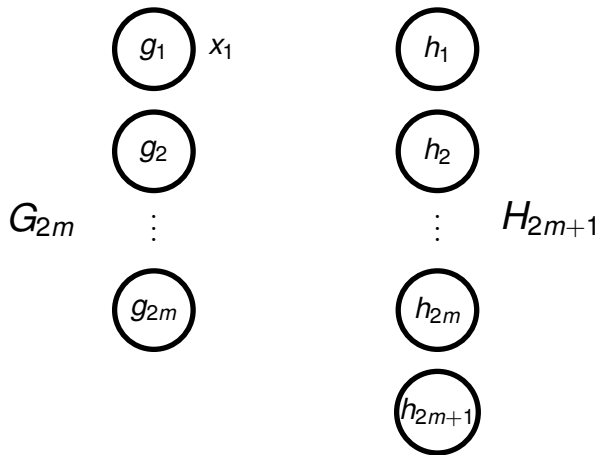
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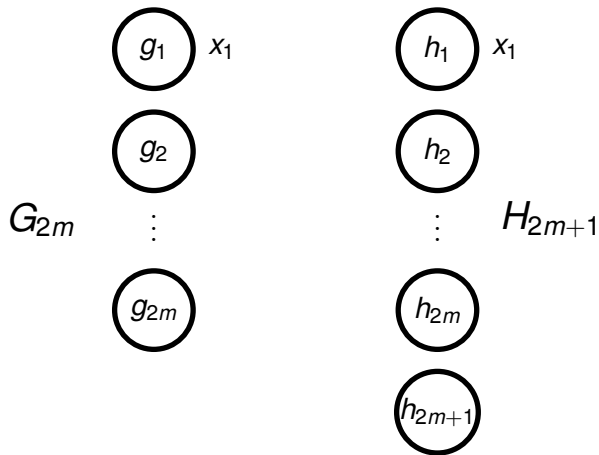
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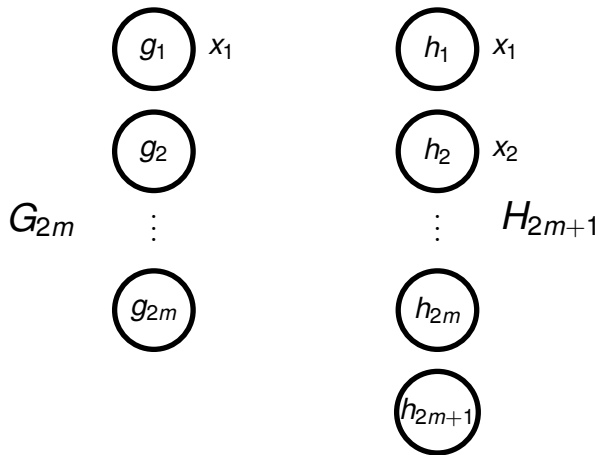
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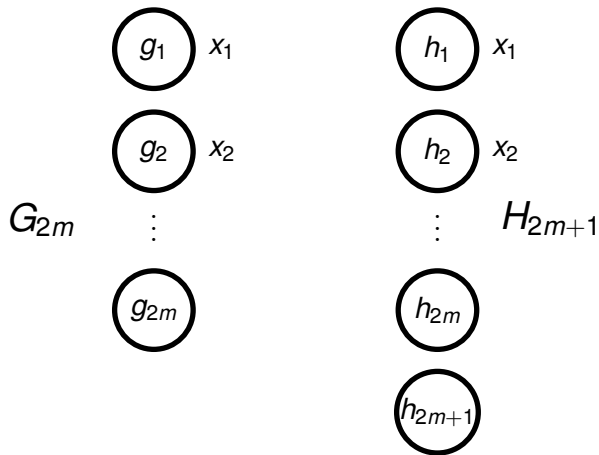
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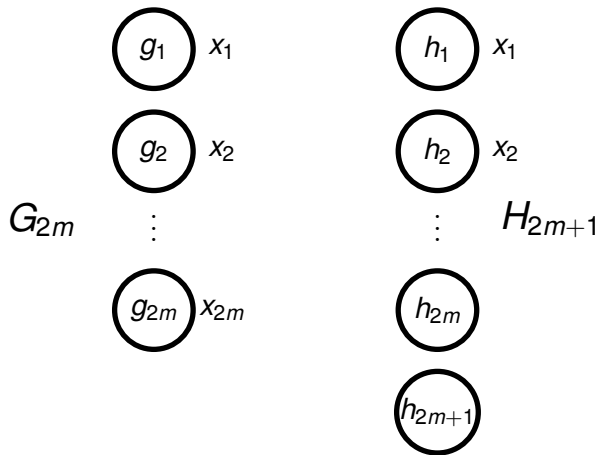
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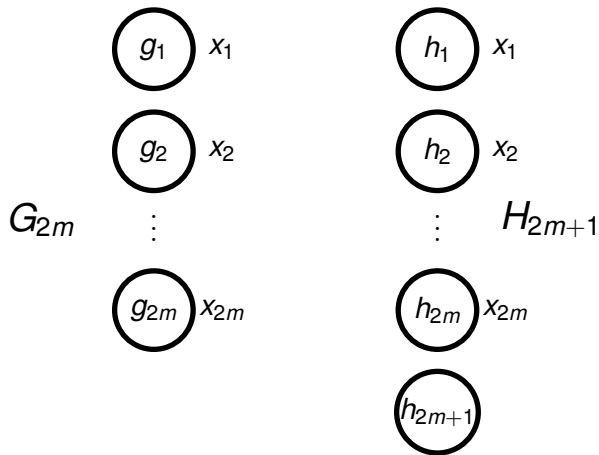
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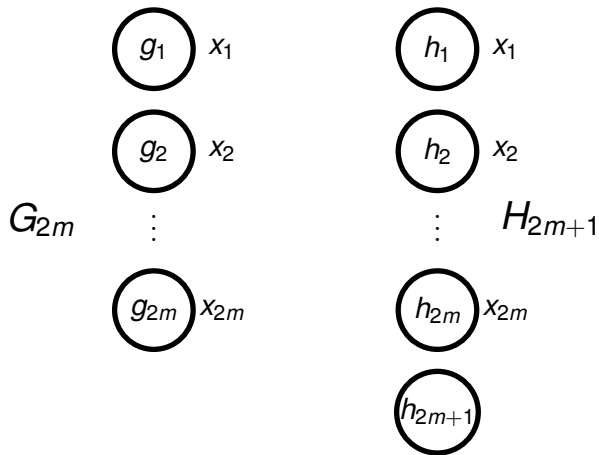
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$$G_{2m} \sim^{2m} H_{2m+1}$$



## Add Counting to FO Logic

Two sorts: **Numbers**:  $\{0, 1, \dots, n\}$ ,  $\leq$ , Plus, Times and  
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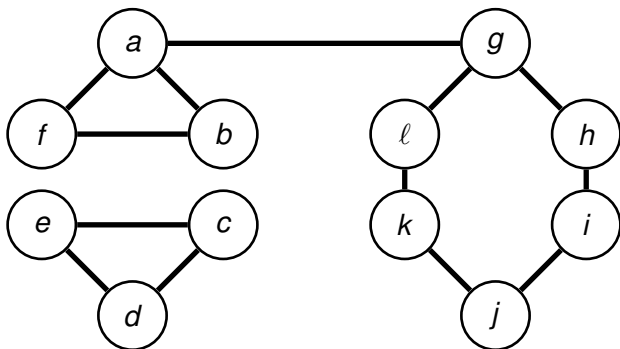
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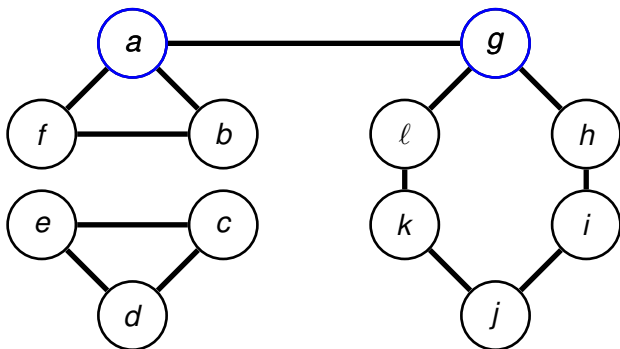
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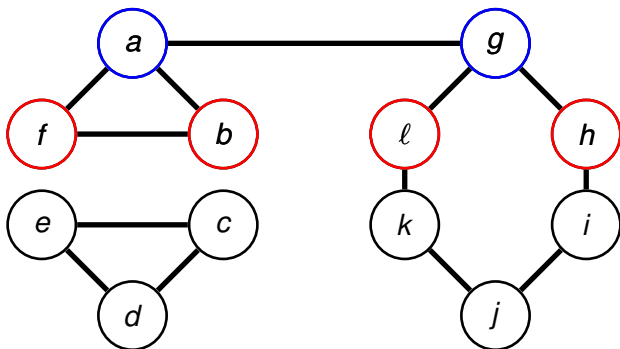
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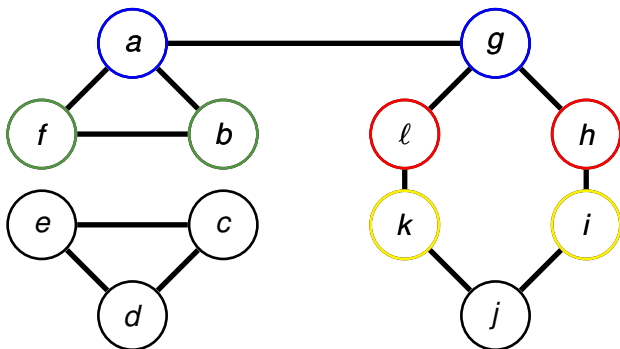
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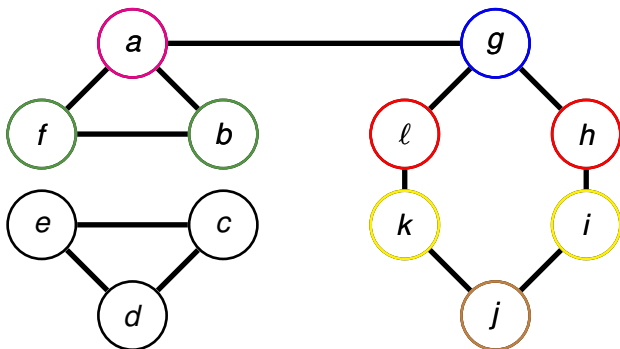
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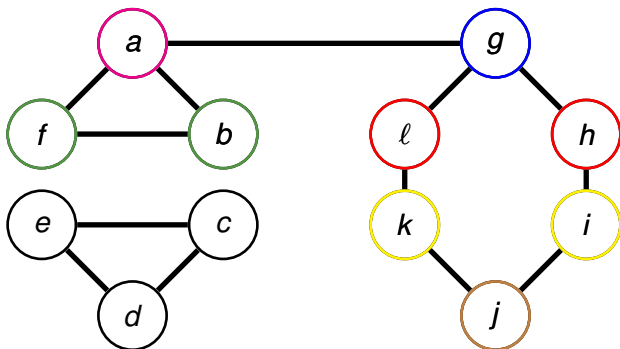
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**Thm.** Stable Coloring of Vertices =  $C^2$  type.

Round  $m$  of stable coloring is quantifier depth of  $C^2$  formula.

## The Good News: Upper Bounds

**Thm.** [Babai, Erdos, Selkow] With high probability, after four iterations of stable coloring, each vertex of a random graph has a unique color, i.e., the  $C_4^2$ -type of each vertex is unique.

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**Thm.** [Babai, 2015]  $GI \in \text{DTIME}[n^{\log^7 n}]$ . (Before this it was only known that  $GI \in \text{DTIME}[n^{\sqrt{n}}]$ .)

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**proof:** Apply arbitrary FO(LFP) formula to the canonical form of the input graph. □

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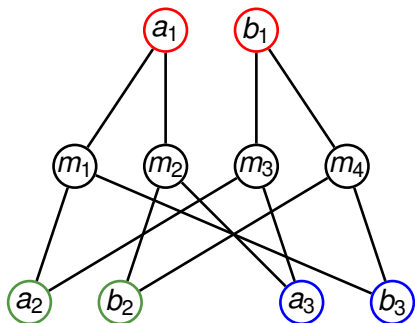
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**Thm.** [CFI] No!

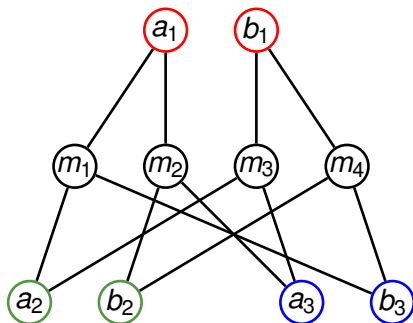
A simple graph property (now called the CFI property) checkable in  $DTIME[n]$ , requires  $v = \Omega(n)$  variables to express in  $C^v$ . Thus,  $CFI \in \mathbf{OIP} - FPC$

# Proof of CFI Thm



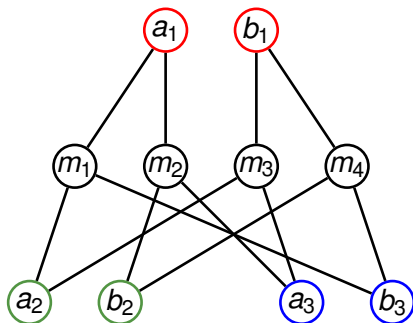
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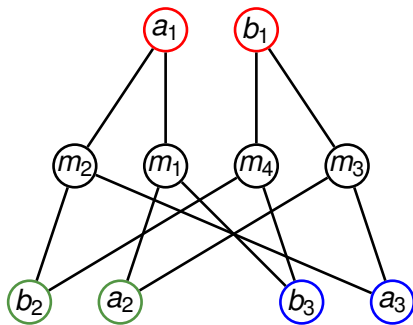
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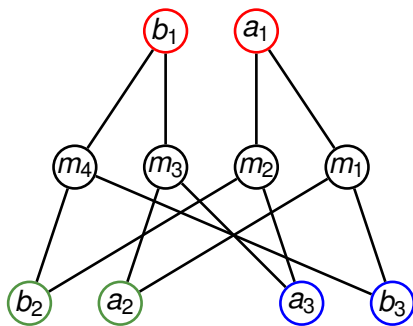
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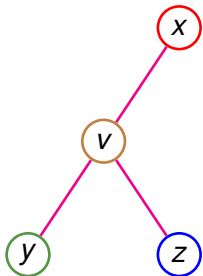
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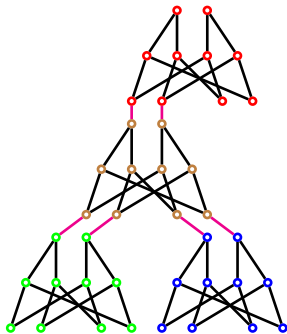
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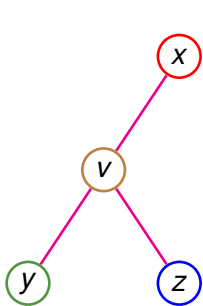


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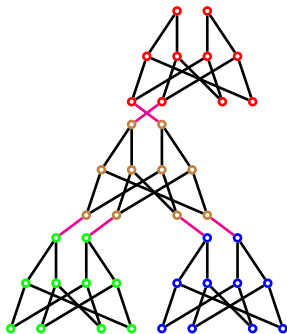


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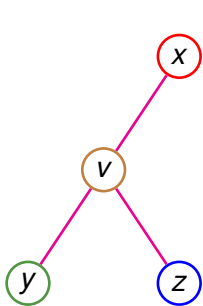


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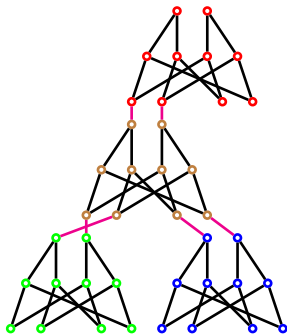


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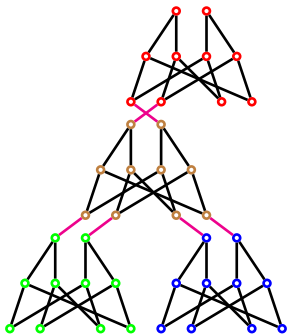
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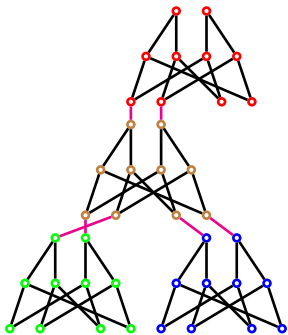
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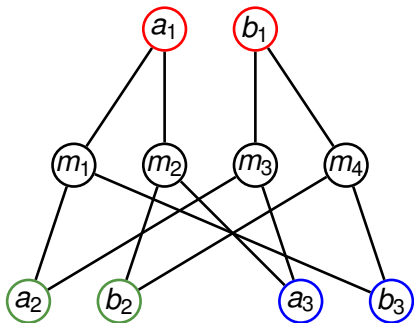


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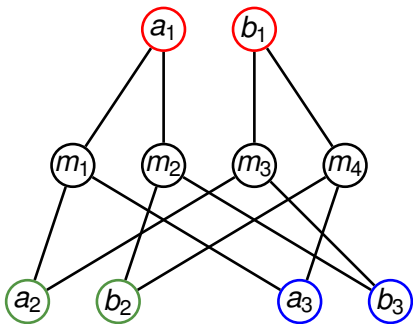


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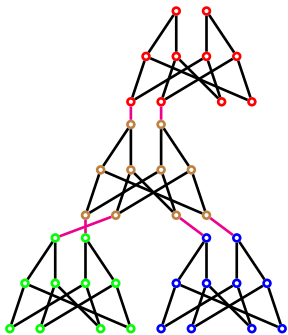
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**proof** Use the ordering to label boundary pairs  $a_i, b_i$  when  $a_i \leq b_i$ . Then count the number,  $m$ , of flips of vertices and edges mod 2.  $X'(G) \in \text{CFI}$  iff  $m$  is even. □



$\tilde{X}(G_n)$

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Thus **Delilah** never loses. □



We have shown that the linear-time CFI problem is in **OIP** – FPC.

**Cor.**  $\Omega(n)$  variables are needed to characterize graphs.

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**Thm.** [Anderson, Dawar and Holm] Linear Programming is in FPC.

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What I want: more natural extension to FPC that adds group theory and characterizes graphs using  $O(\log n)$  variables.

