

# The restriction method in circuit and proof complexity

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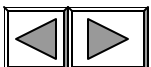
# Circuit lower bound for parity

- Theorem [Hastad] The  $n$ -bit parity function  $x_1 \wedge x_2 \wedge \dots \wedge x_n$  cannot be computed by unbounded fan-in circuits in size  $S$  and depth  $d$  unless 
$$S \geq 2^{cn^{1/d}}$$

- Corollary: Polynomial-size circuits for parity require  $W(\log n / \log \log n)$  depth

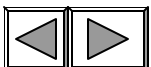
- Parity  $\notin AC^0$

- Original proof used **restriction** argument



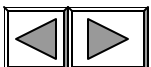
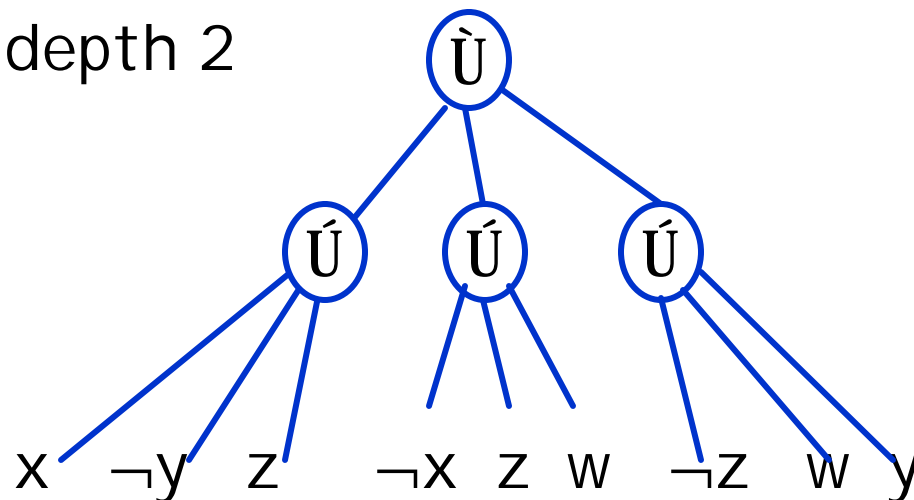
# Restrictions

- **Defn:** Given a set  $X$  of Boolean variables, a restriction  $r$  is a partial assignment of values to the variables of  $X$ 
  - formally  $r : X \rightarrow \{0, 1, *\}$  where  $r(x_i) = *$  indicates that the variable  $x_i$  is not assigned a value
- If  $F$  is a function, formula, or circuit, write  $F|_r$  for the result of substituting  $r(x_i)$  for each  $x_i$  s.t.  $r(x_i) \neq *$



# Unbounded fan-in circuits

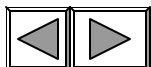
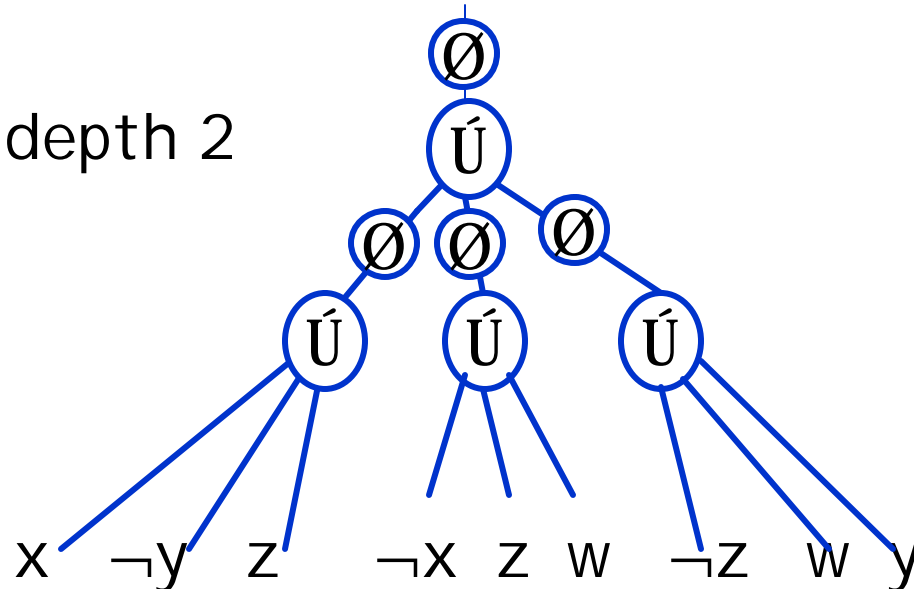
- Restrict to connectives  $\hat{\cup}, \hat{\cap}$ 
  - results for other connective is easily defined
- Defn: The **depth** of a formula **F** (circuit **C**) is **max #** of  $\hat{\cup}$  on any path from an input to an output
- e.g. **CNF/DNF** have depth 2



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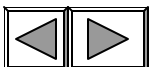
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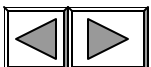
# Why restrictions might be useful for circuit lower bounds

- Restrictions simplify functions, circuits, formulas
  - Given  $F = (V_i x_i \cup V_j \bar{x}_j)$ 
    - assigning a single  $r(x_i) = 1$  or a  $r(x_j) = 0$  makes  $F|_r$  a constant; i.e. wiping out  $F$  but only setting one variable
  - Simplification is substantially more than # of variables assigned
- Basic idea: To prove that small circuit  $C$  cannot compute function  $f$ , choose a restriction  $r$  such that
  - $f|_r$  is still complicated but
  - $C|_r$  is extremely simple so that it obviously cannot compute  $f|_r$

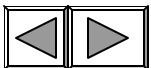
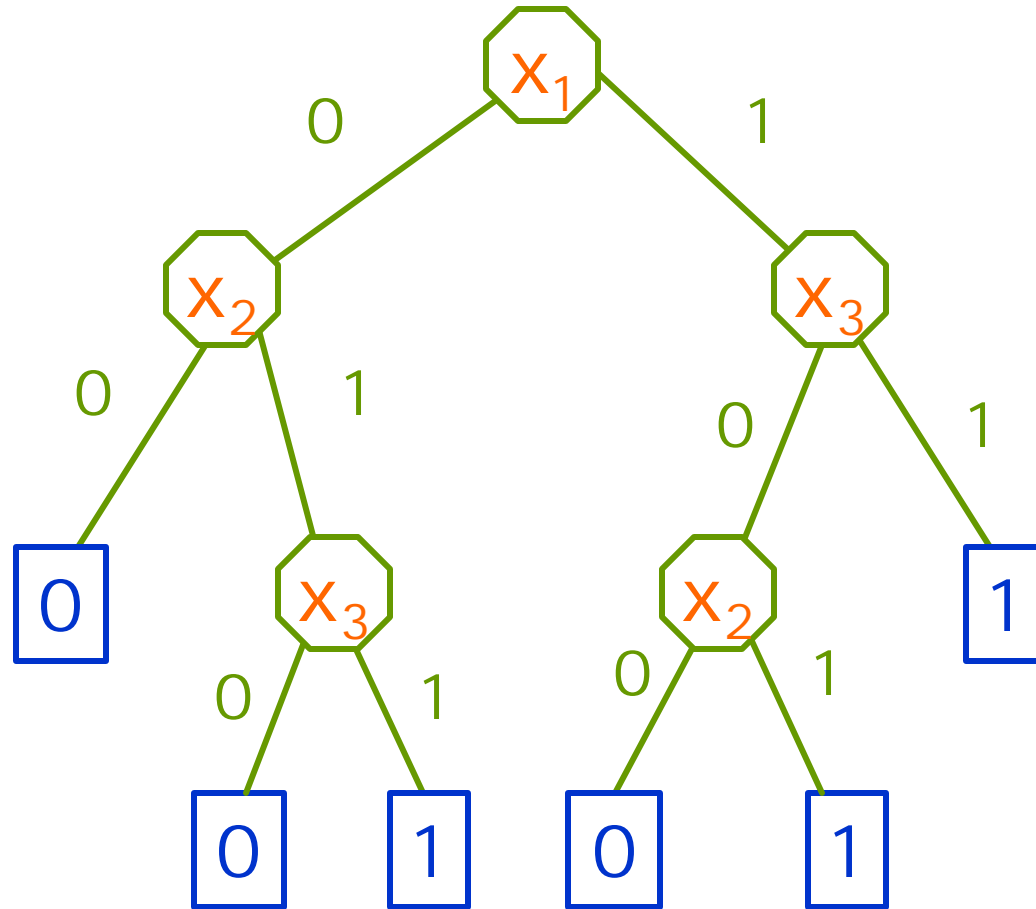


# Boolean decision trees

- **Defn:** A **Boolean decision tree**  $T$  is a binary rooted tree s.t.
  - each internal node is labelled by some  $x_i$
  - leaf nodes are labelled  $0$  or  $1$
  - edges out of each internal node are labelled  $0$  or  $1$
- no two nodes on a path have the same variable label



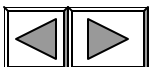
# A Boolean Decision Tree



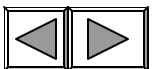
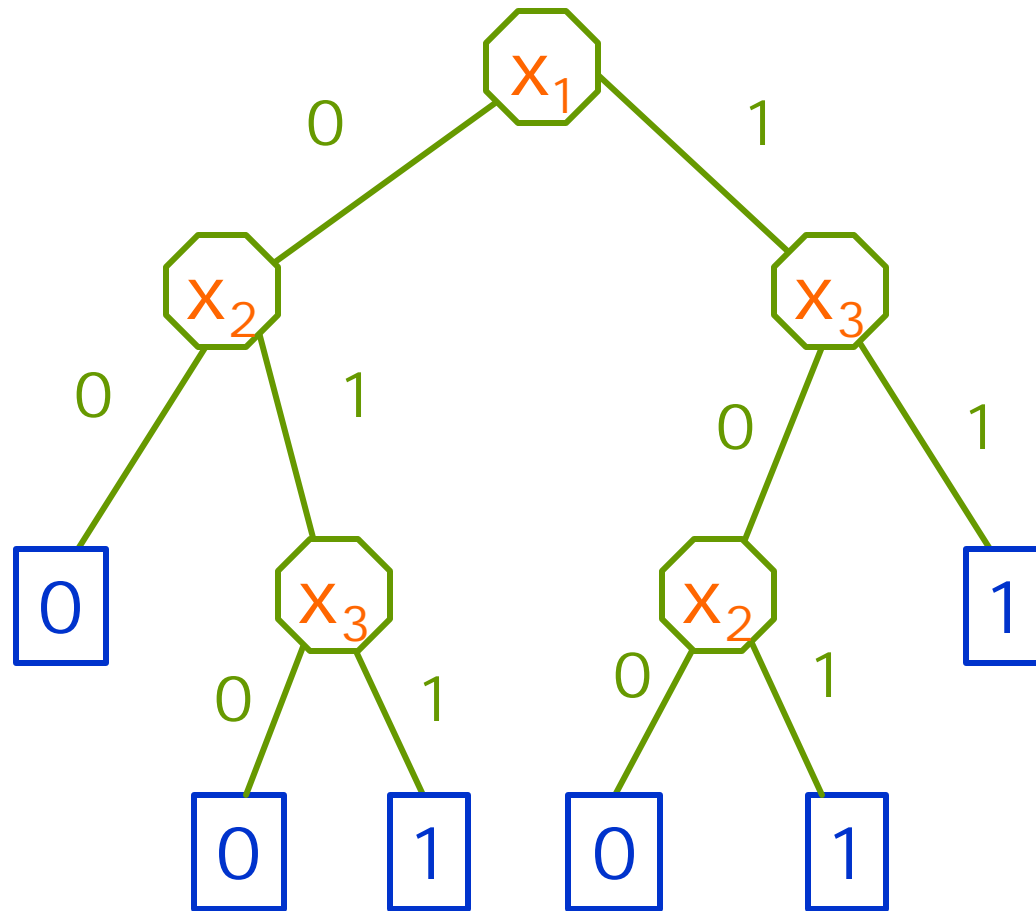


# Paths in decision trees

- Every root-leaf path (**branch**) corresponds to a restriction **r** of the input variables
  - For  $b \in \{0,1\}$ ,  $x_i \leftarrow b$  is in **r** iff on that branch the out-edge labelled **b** is taken from node labelled  $x_i$
- The tree **T** **computes f** iff for every branch **B** of **T**
  - the restriction **r** corresponding to branch **B** has the property that  $f|_r$  equals the leaf label of **B**

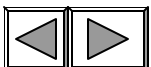


Tree for  $f(x) = 'x_1 + x_2 + x_3 \geq 2'$



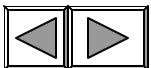
# Property of Decision Trees

- Decision trees  $\Rightarrow$  DNF: Every function computed by a decision tree of height  $t$  can be represented
  - in CNF with clause size at most  $t$ 
    - clauses correspond to branches with leaf label 0
  - in DNF with term size at most  $t$ 
    - terms correspond to branches with leaf label 1
- DNF  $\Rightarrow$  decision tree
  - Canonical conversion



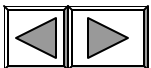
# DNF $\Rightarrow$ decision tree

$$F = x_1 \overline{x_3} \vee x_3 x_4 \vee \overline{x_4} x_6$$



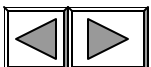
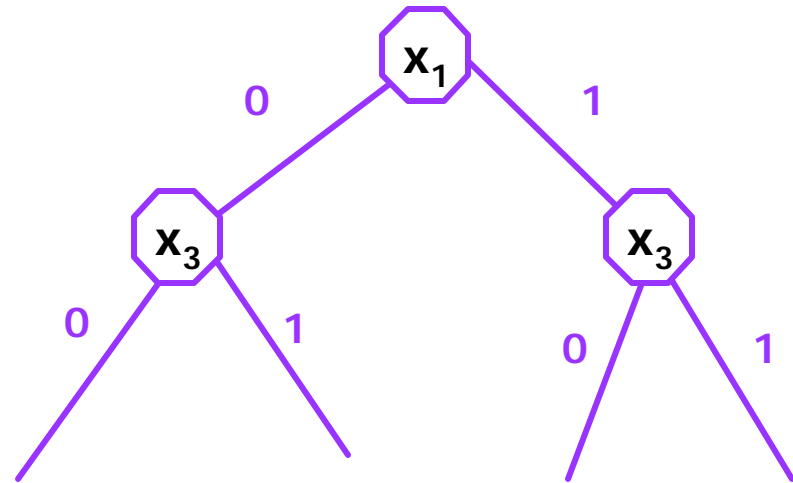
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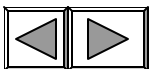
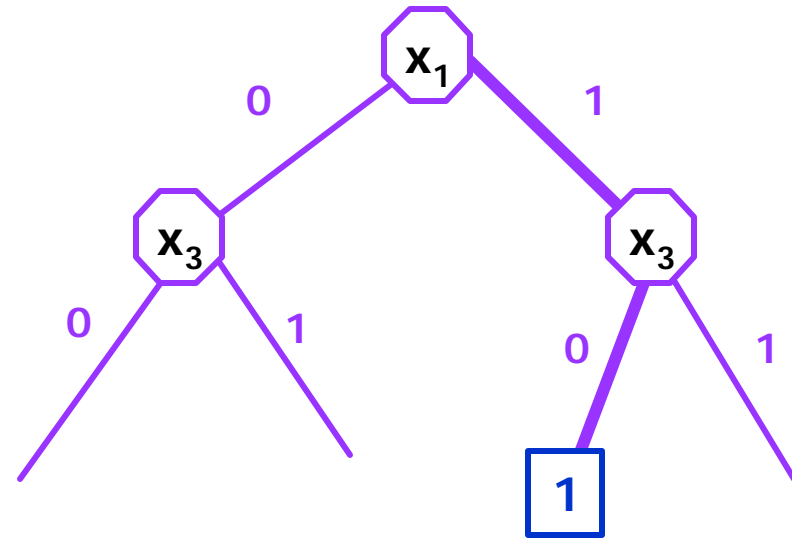
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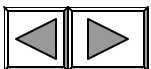
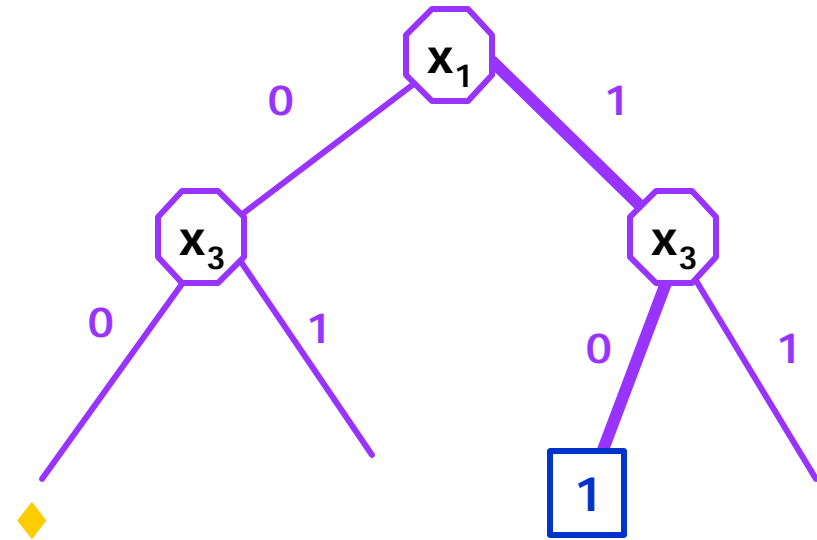
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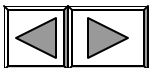
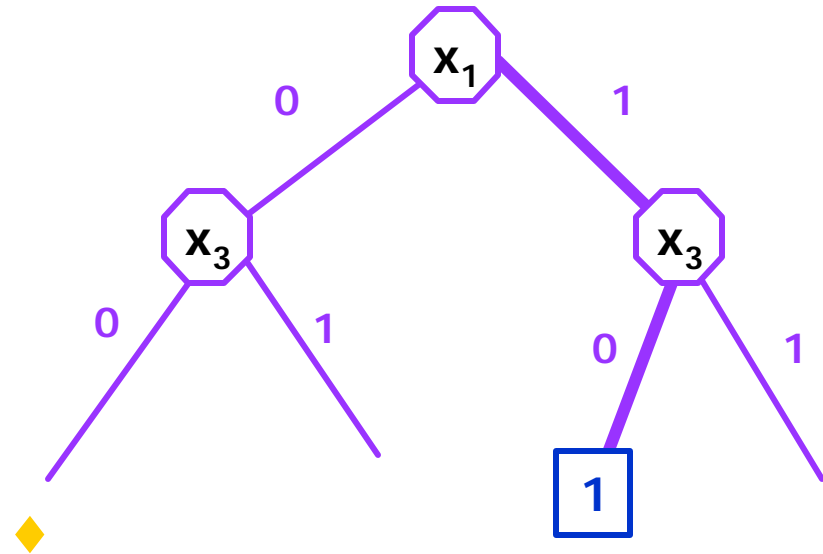
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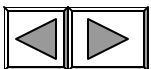
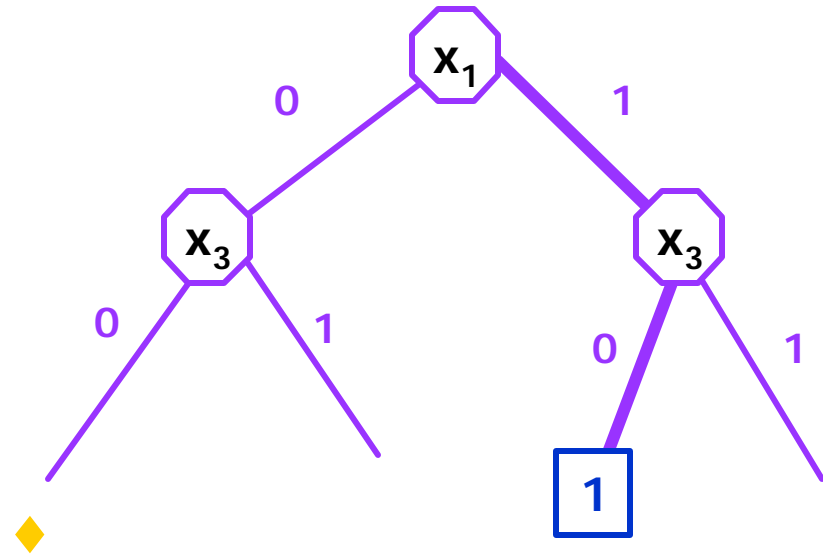
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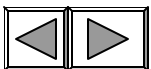
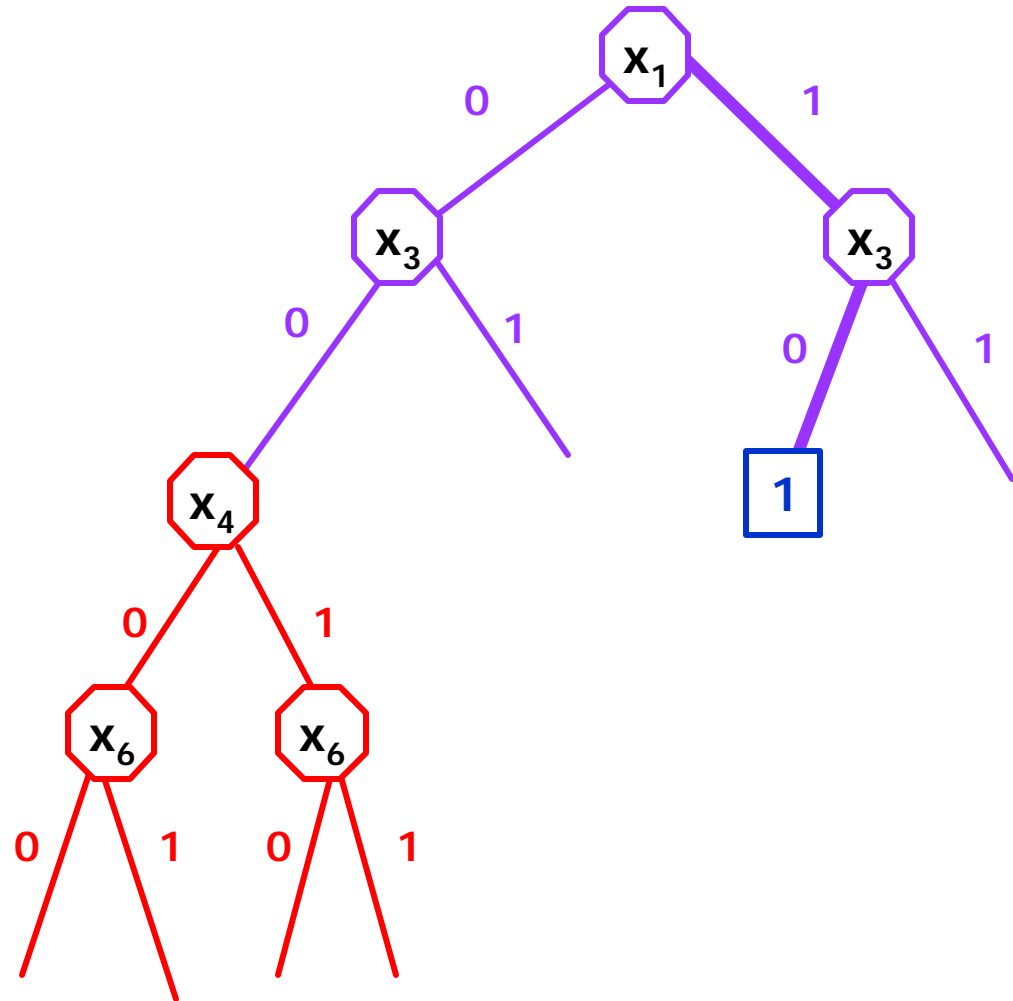
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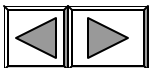
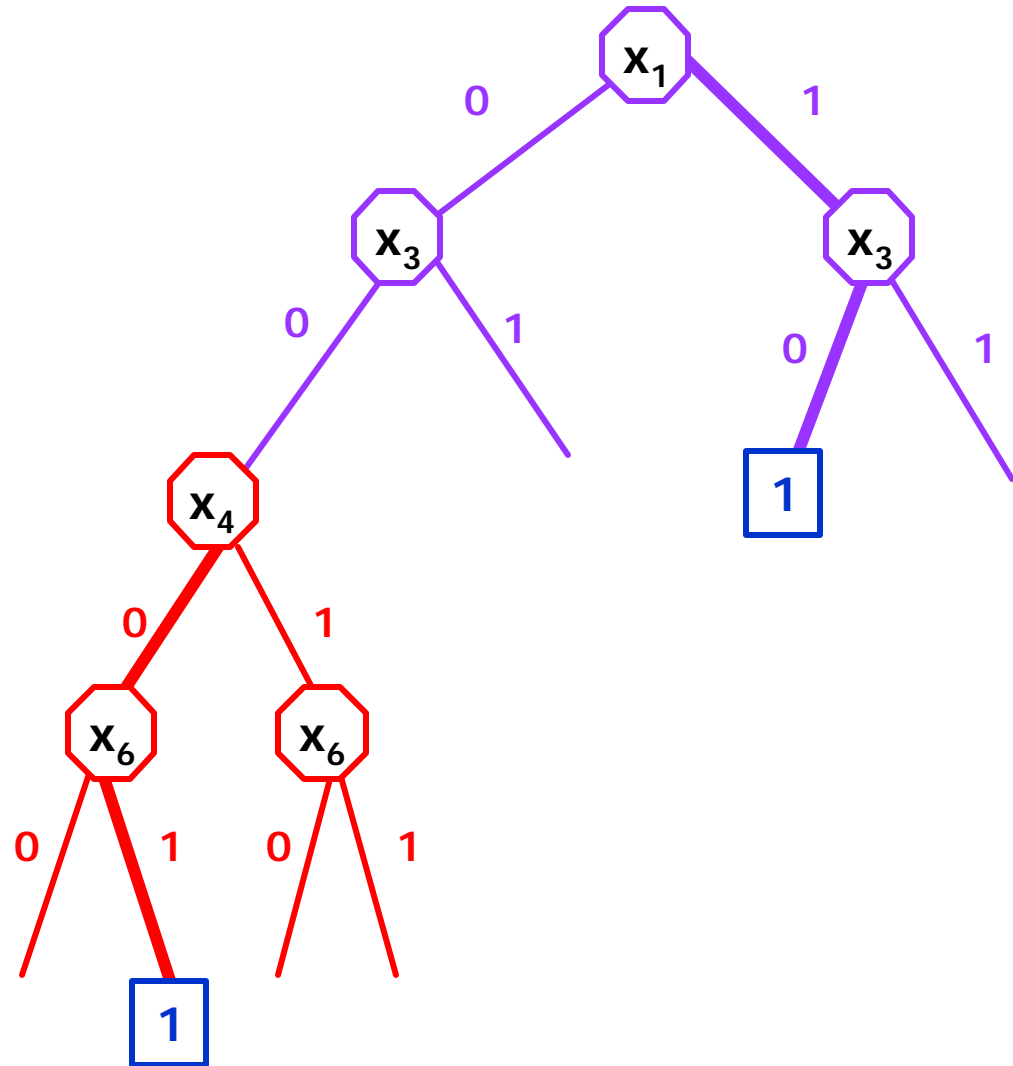
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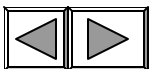
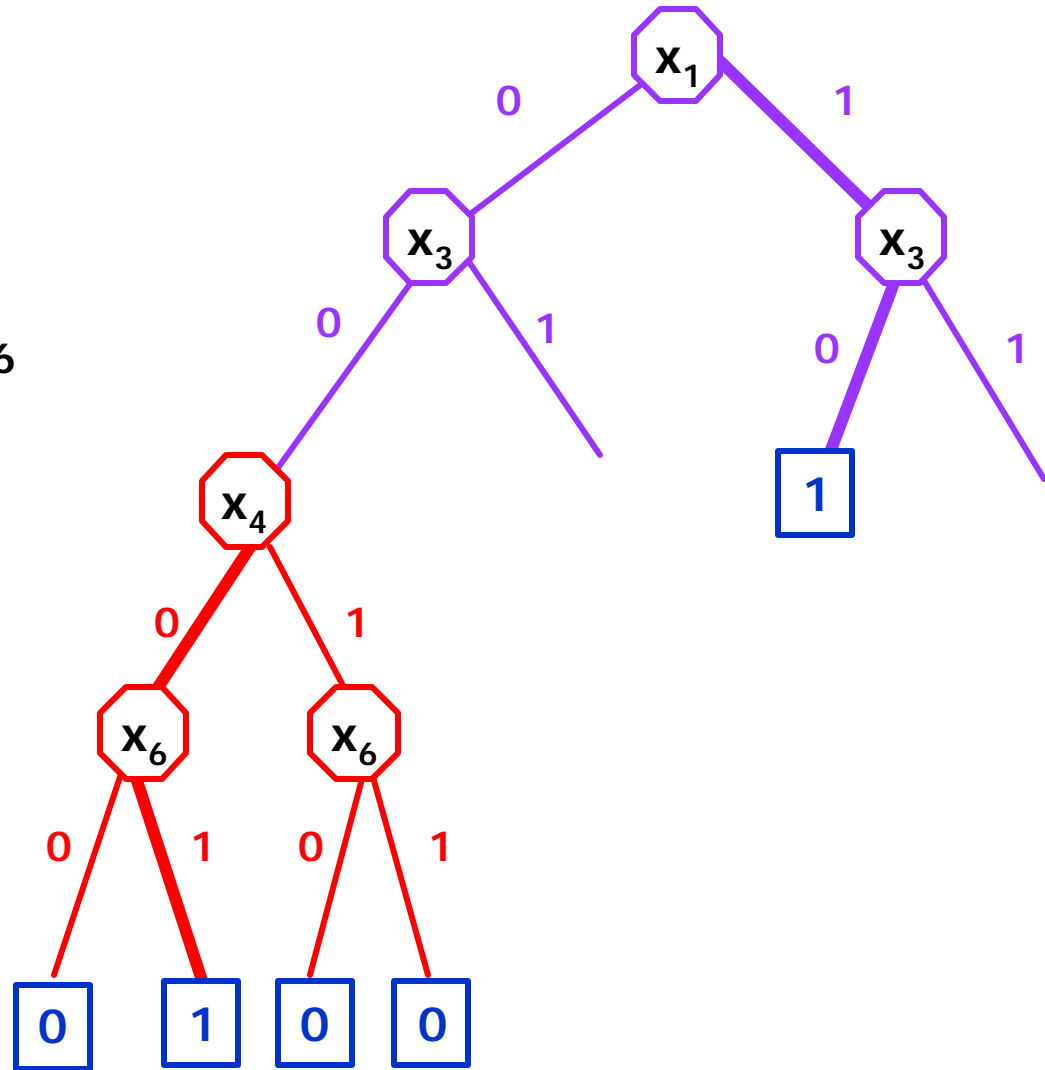
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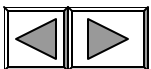
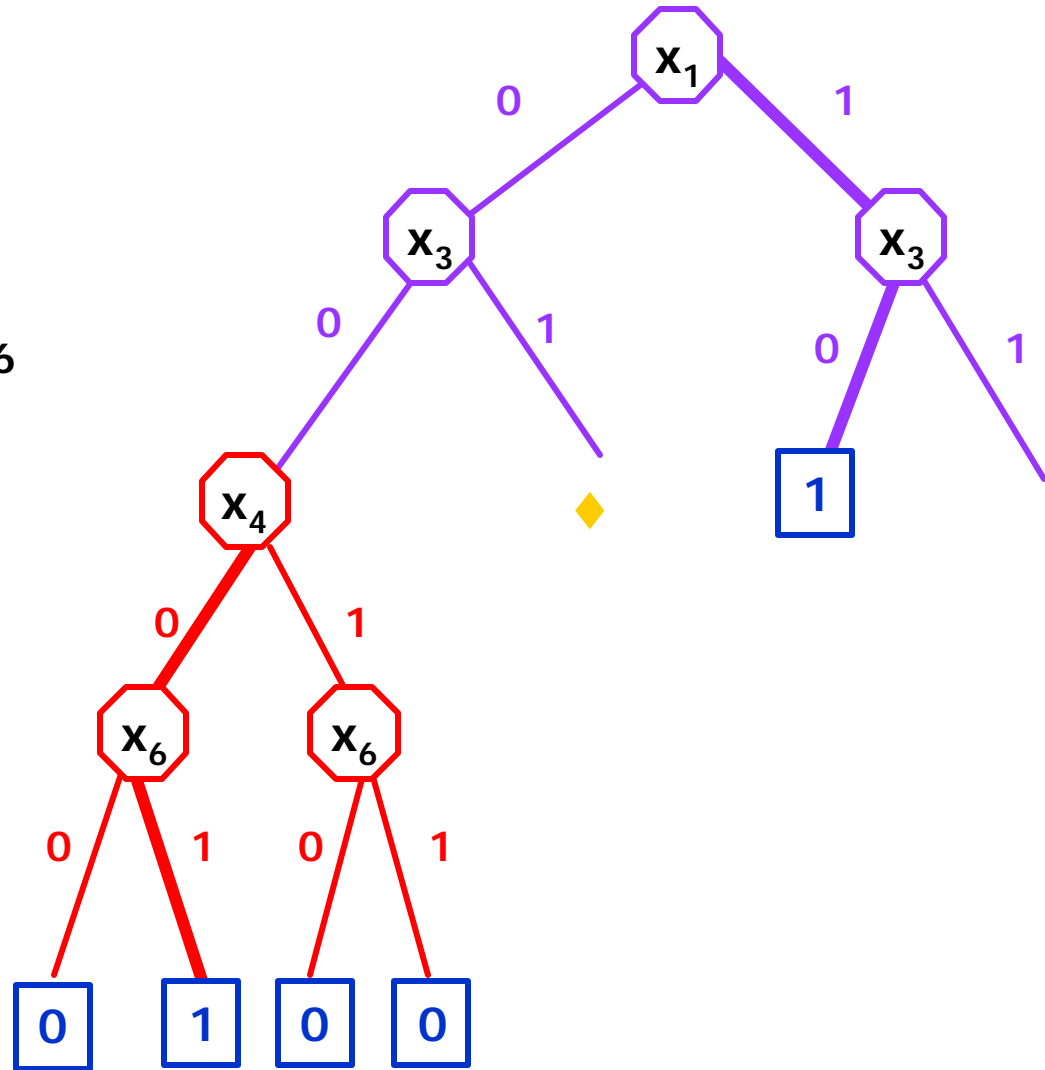
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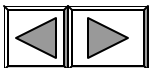
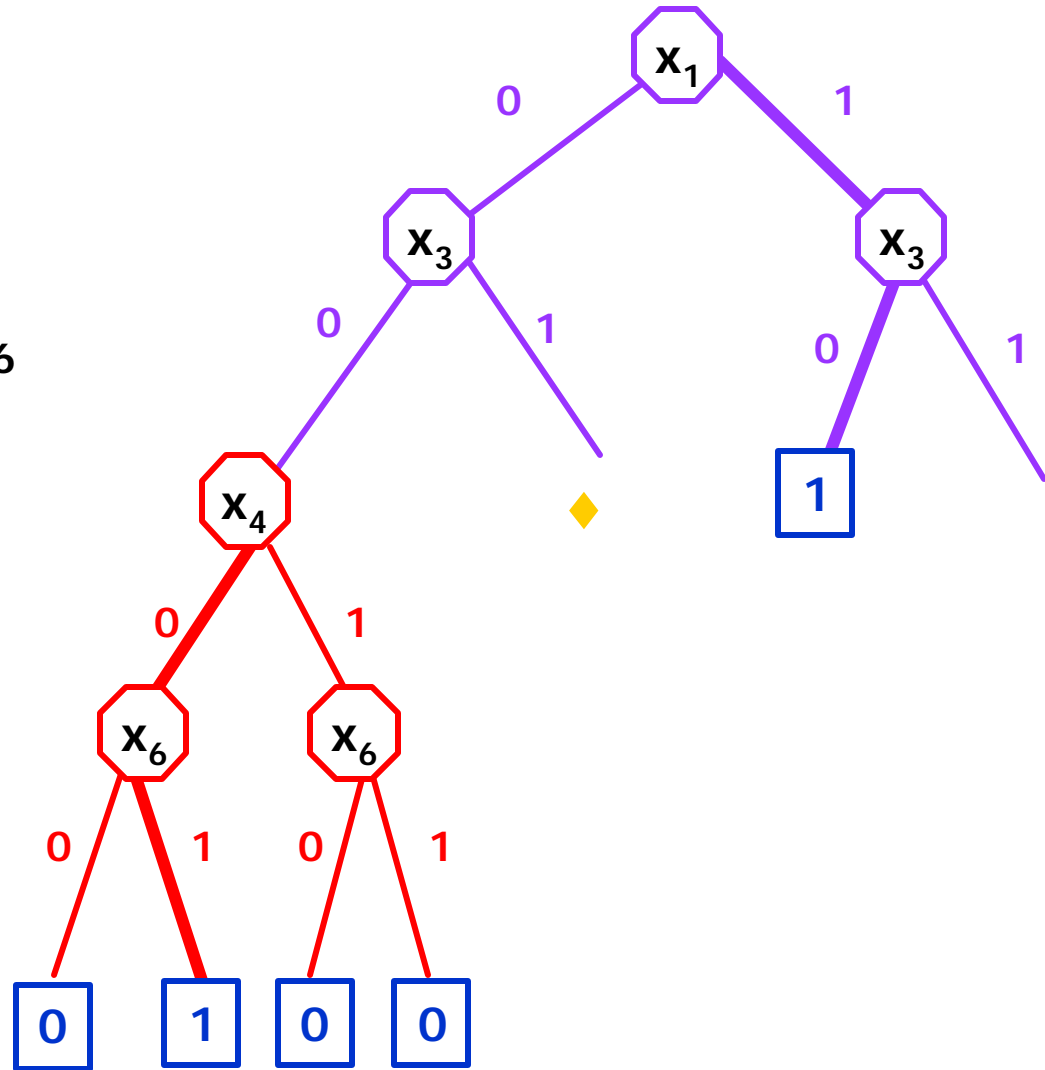
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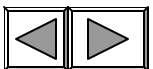
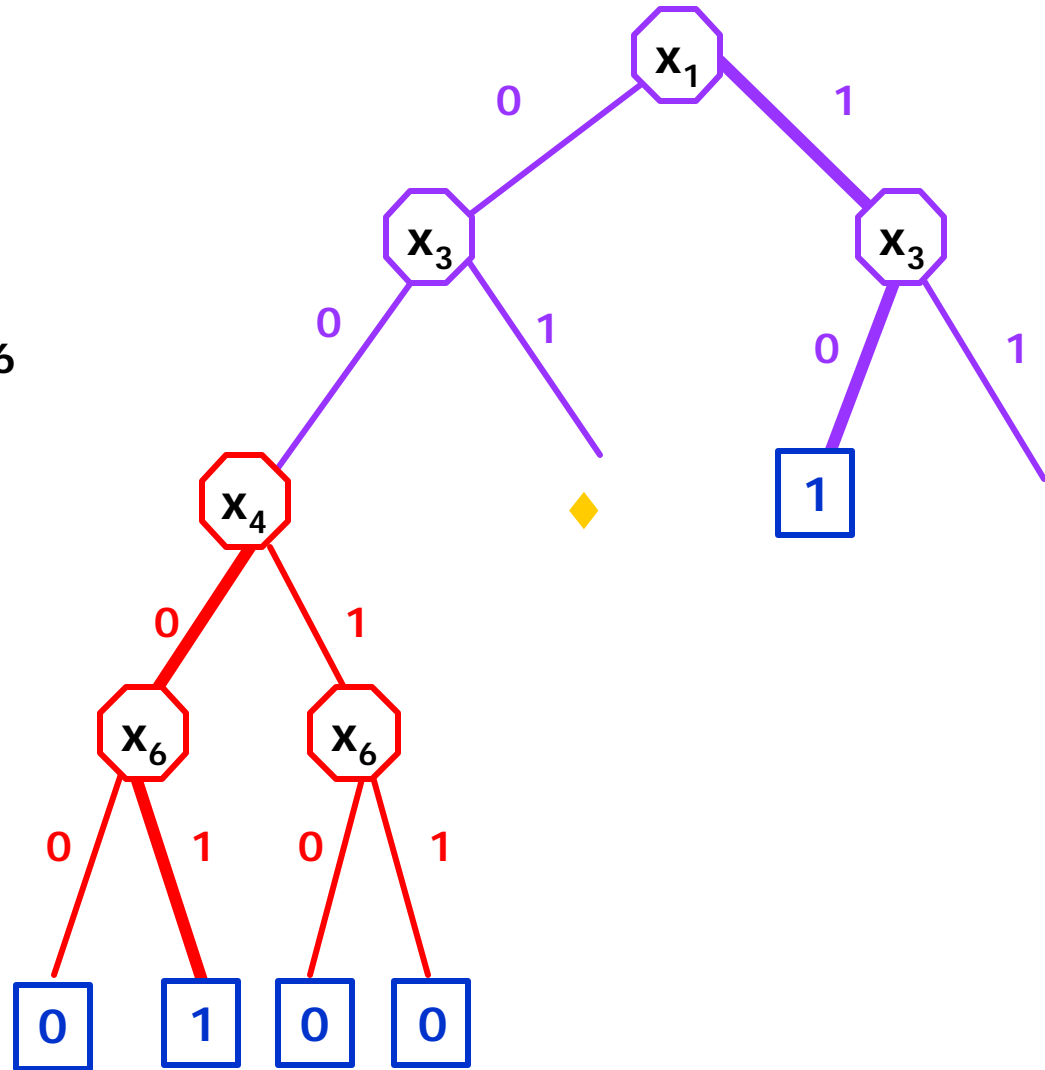
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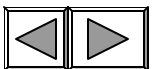
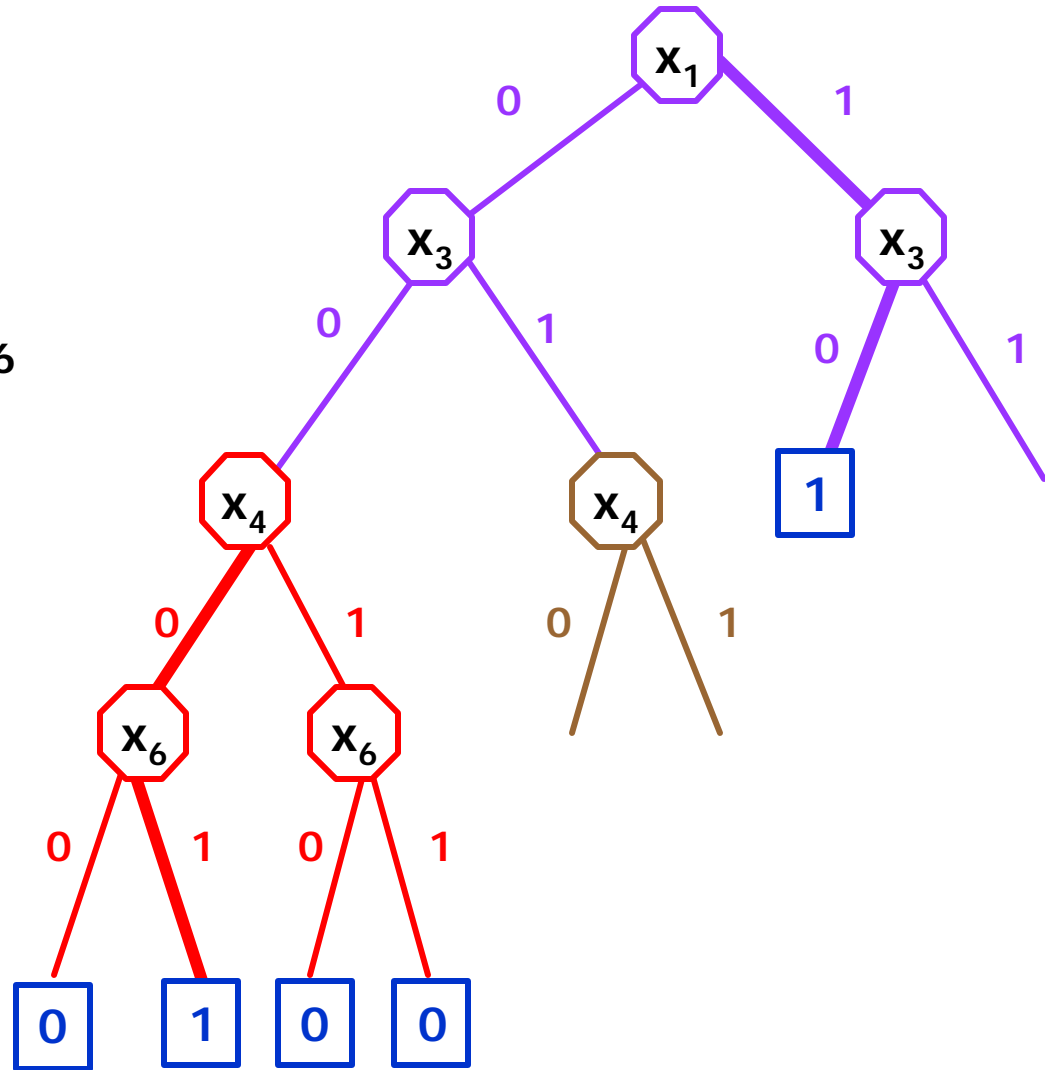
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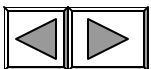
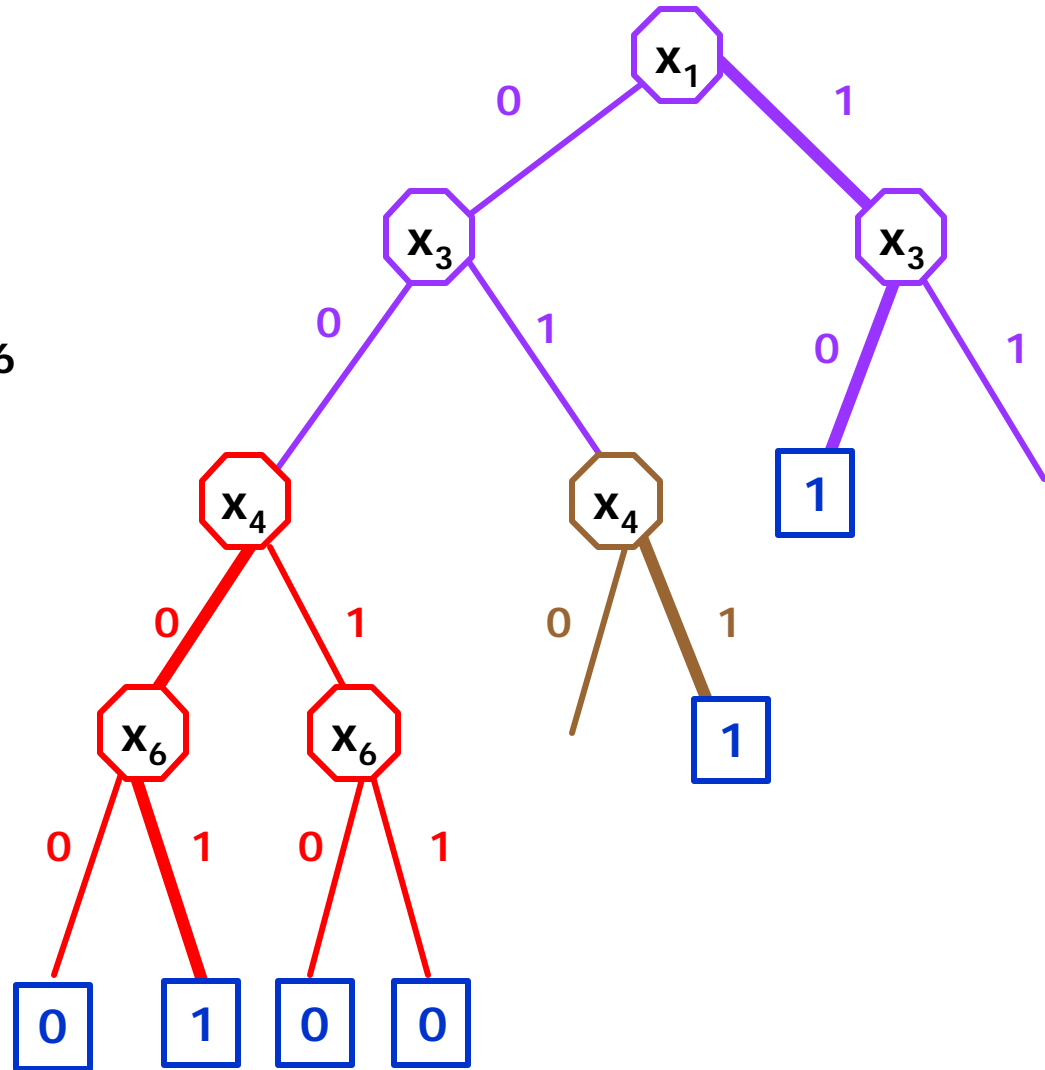
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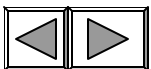
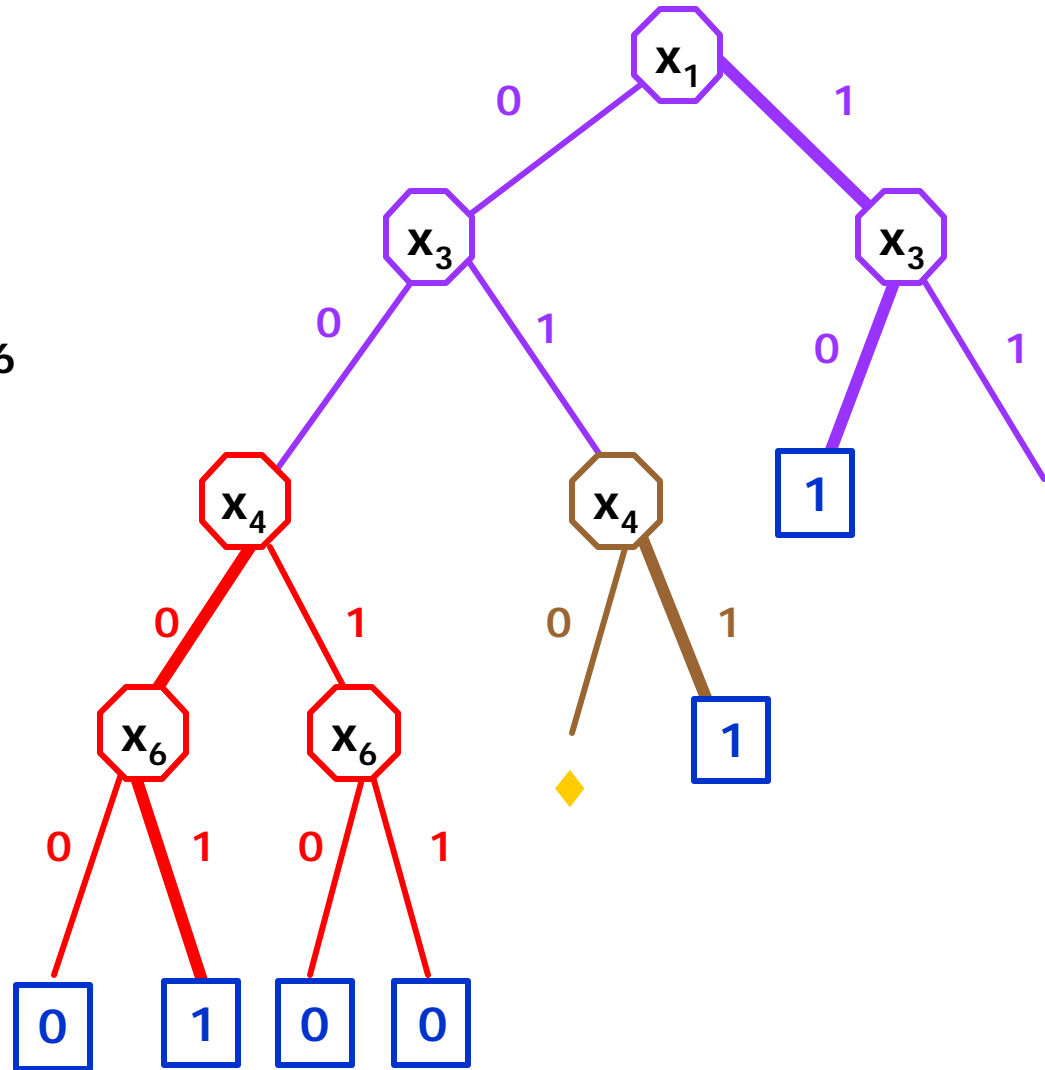
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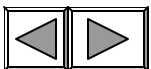
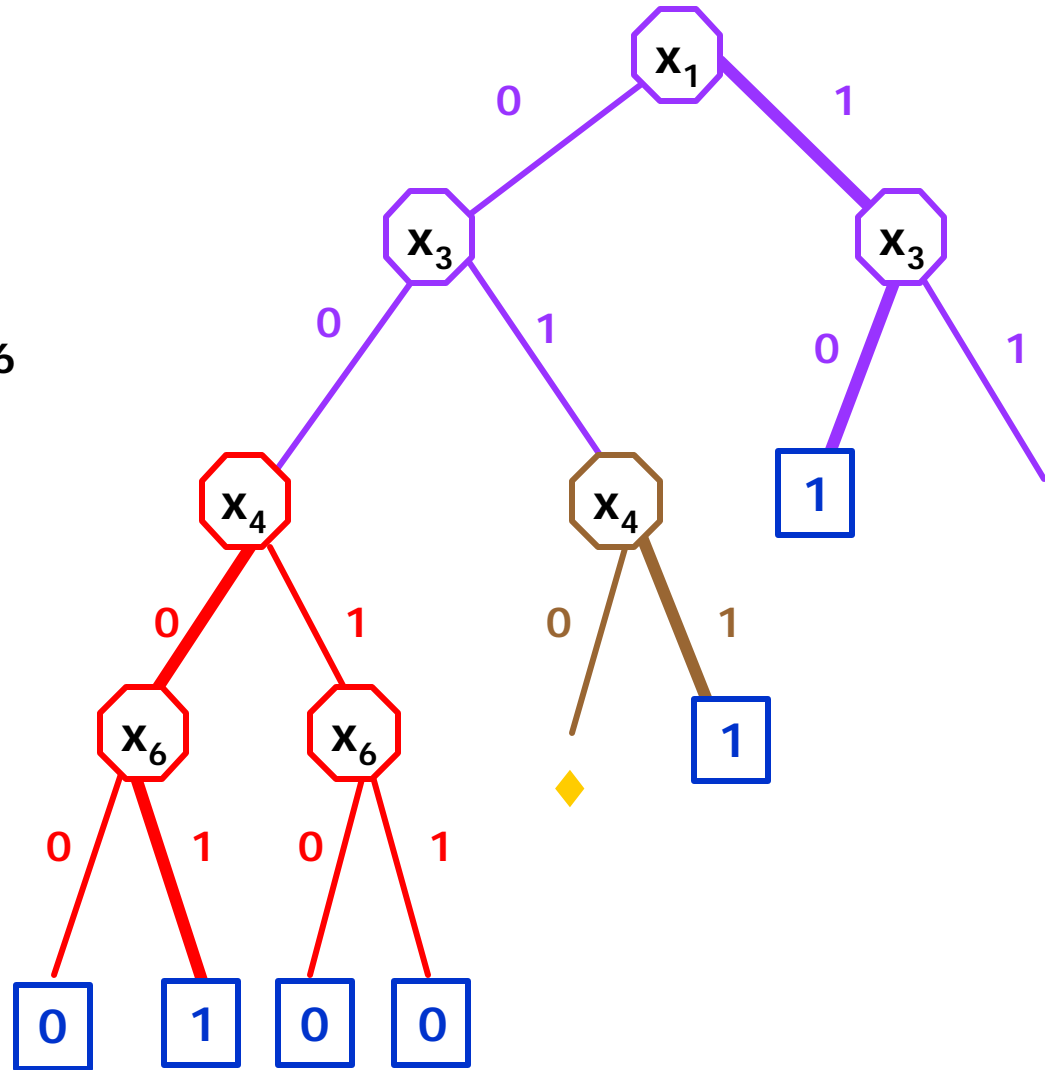
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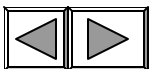
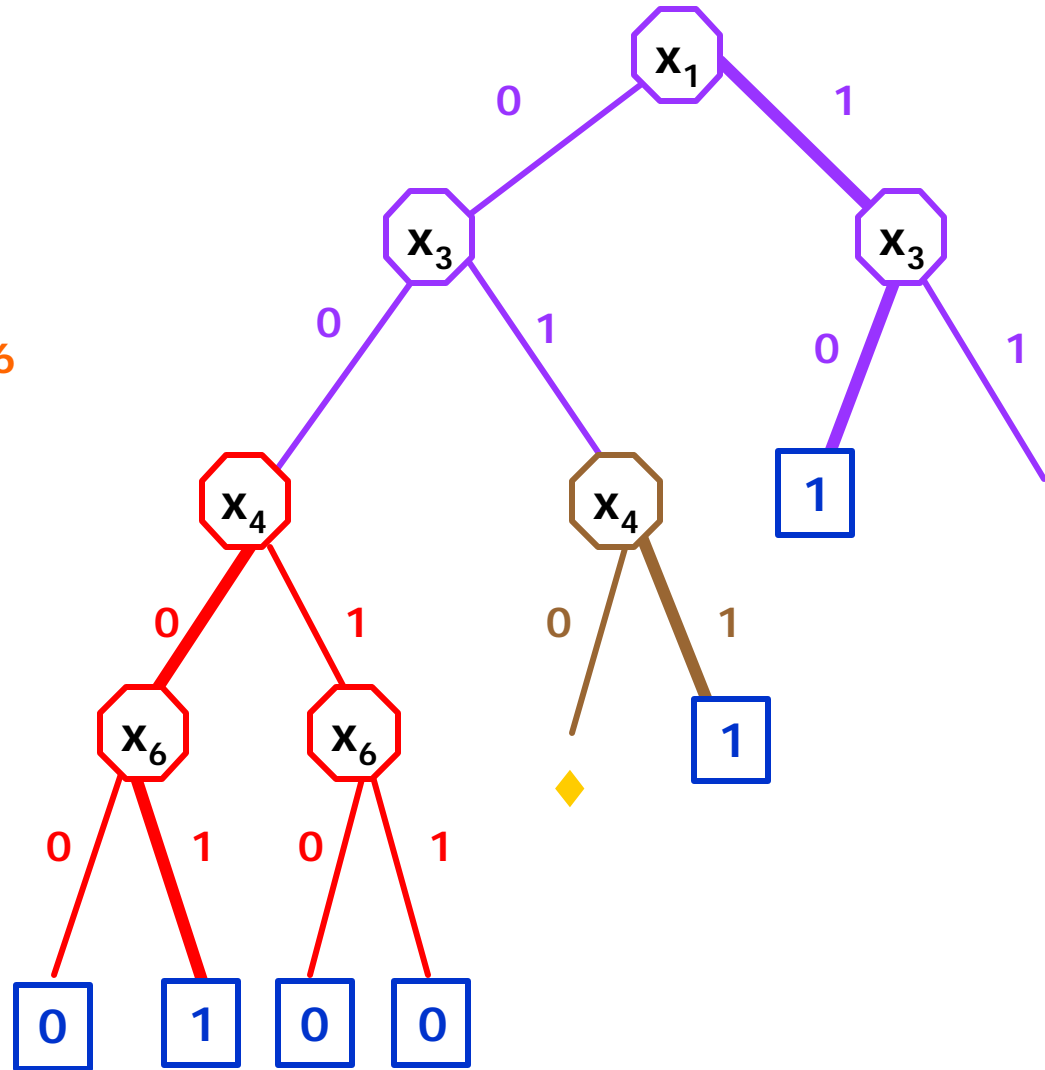
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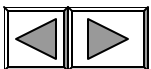
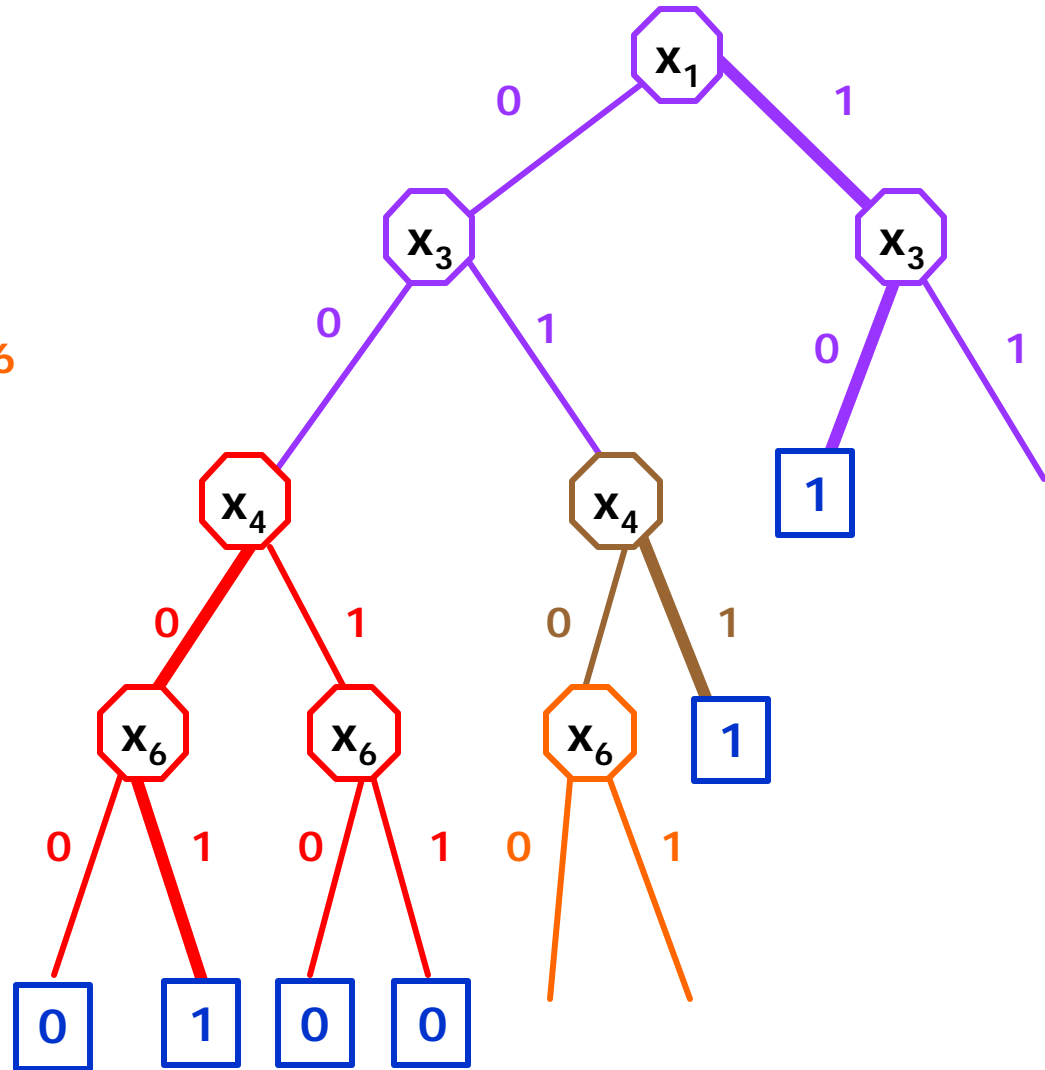
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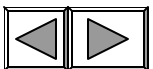
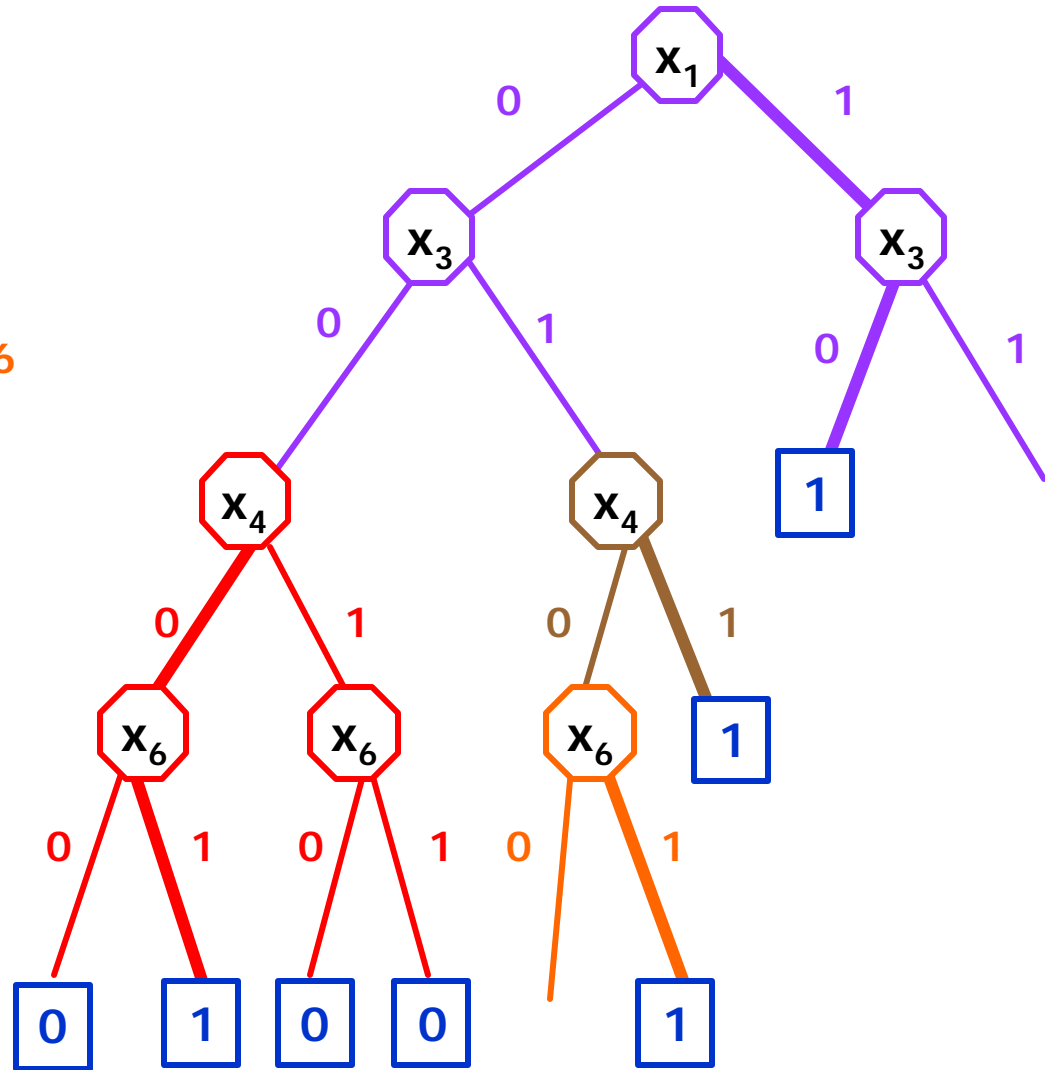
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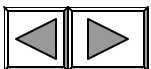
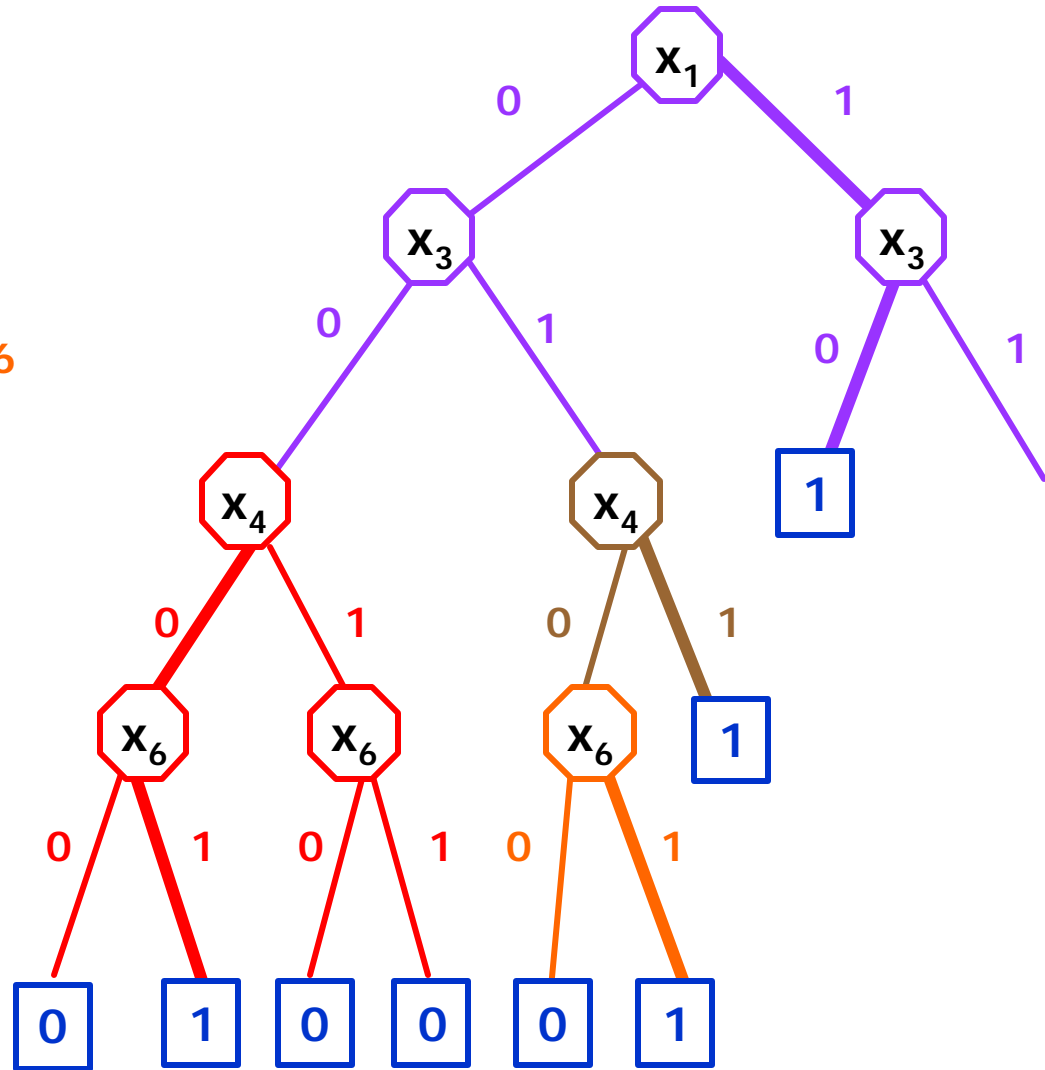
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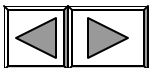
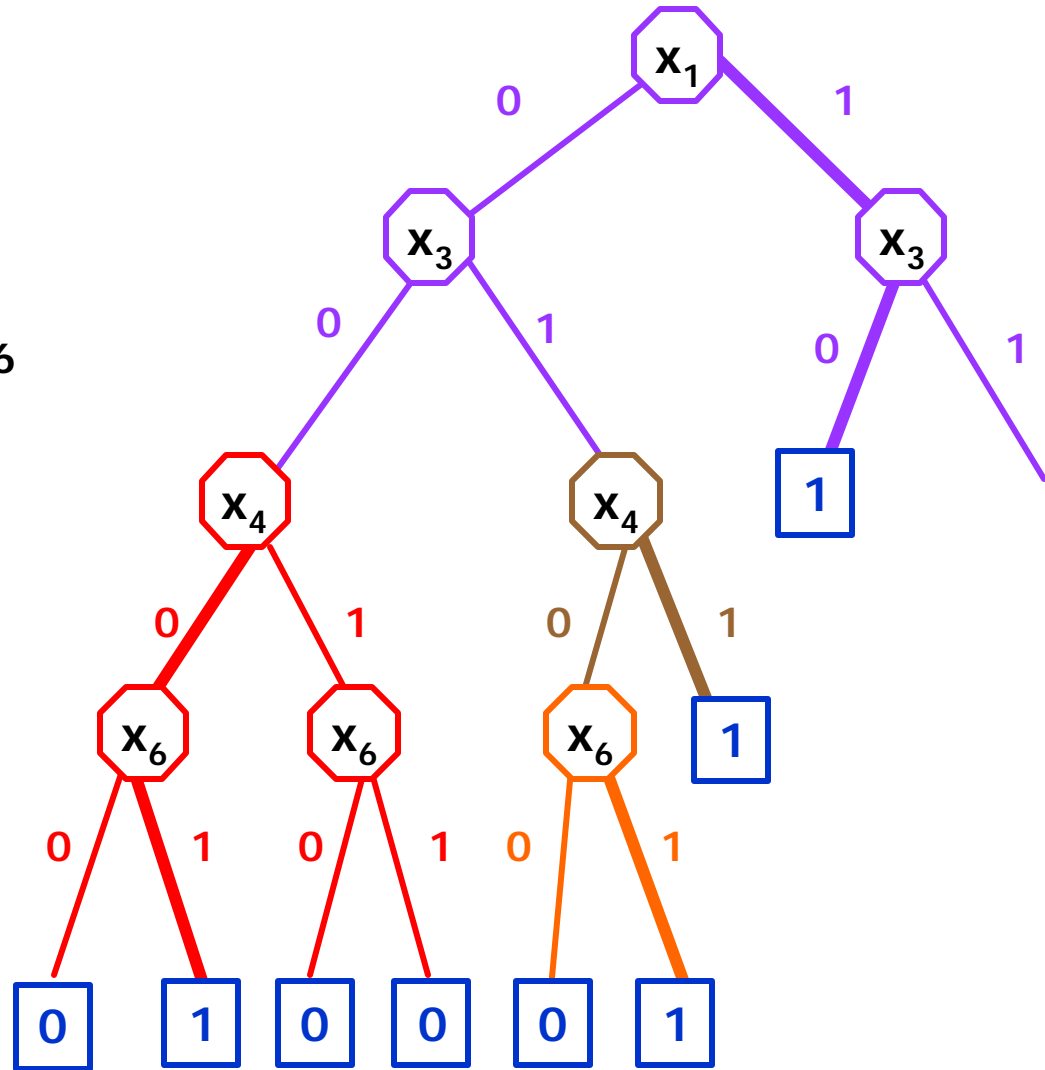
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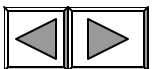
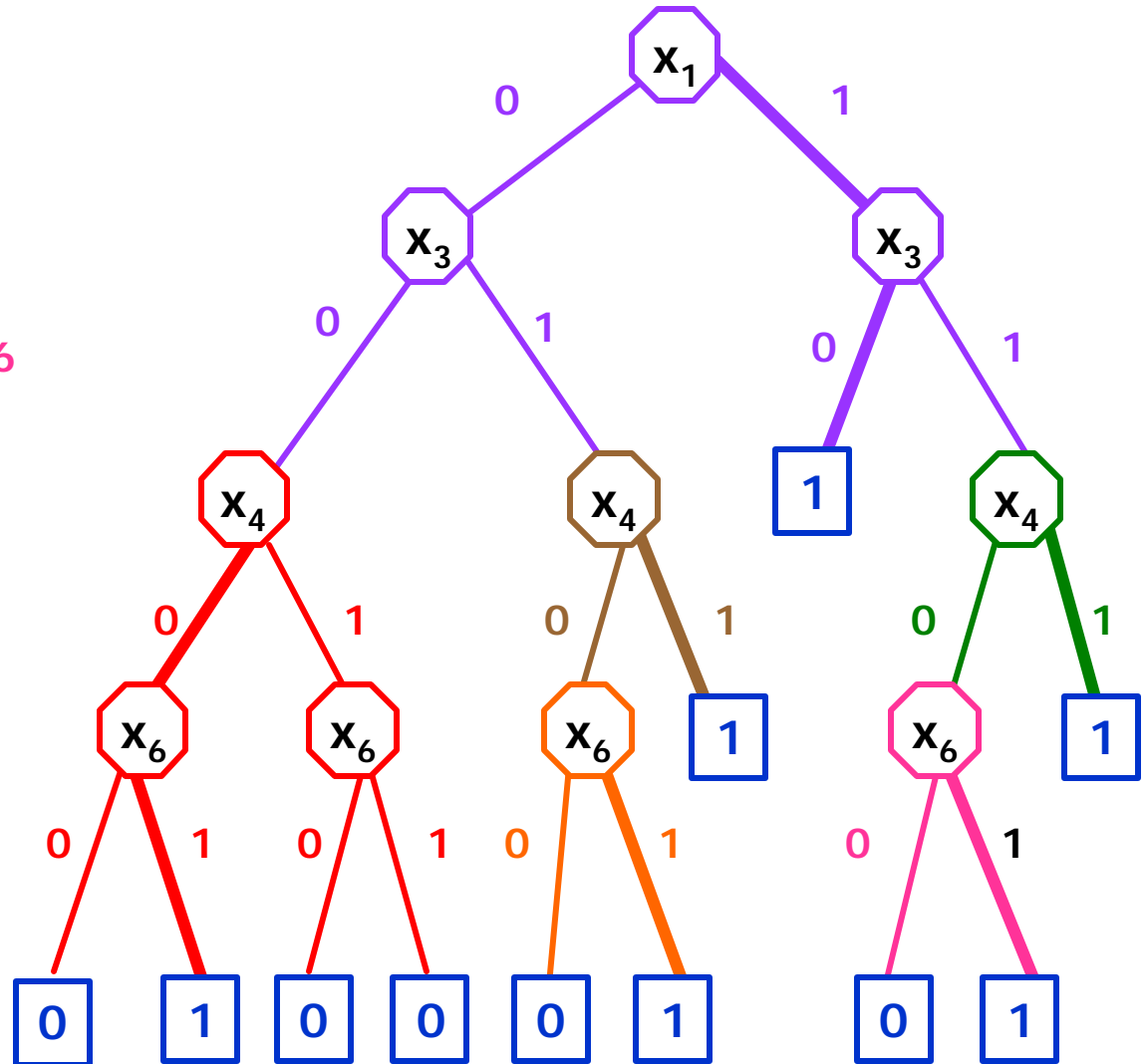
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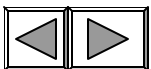
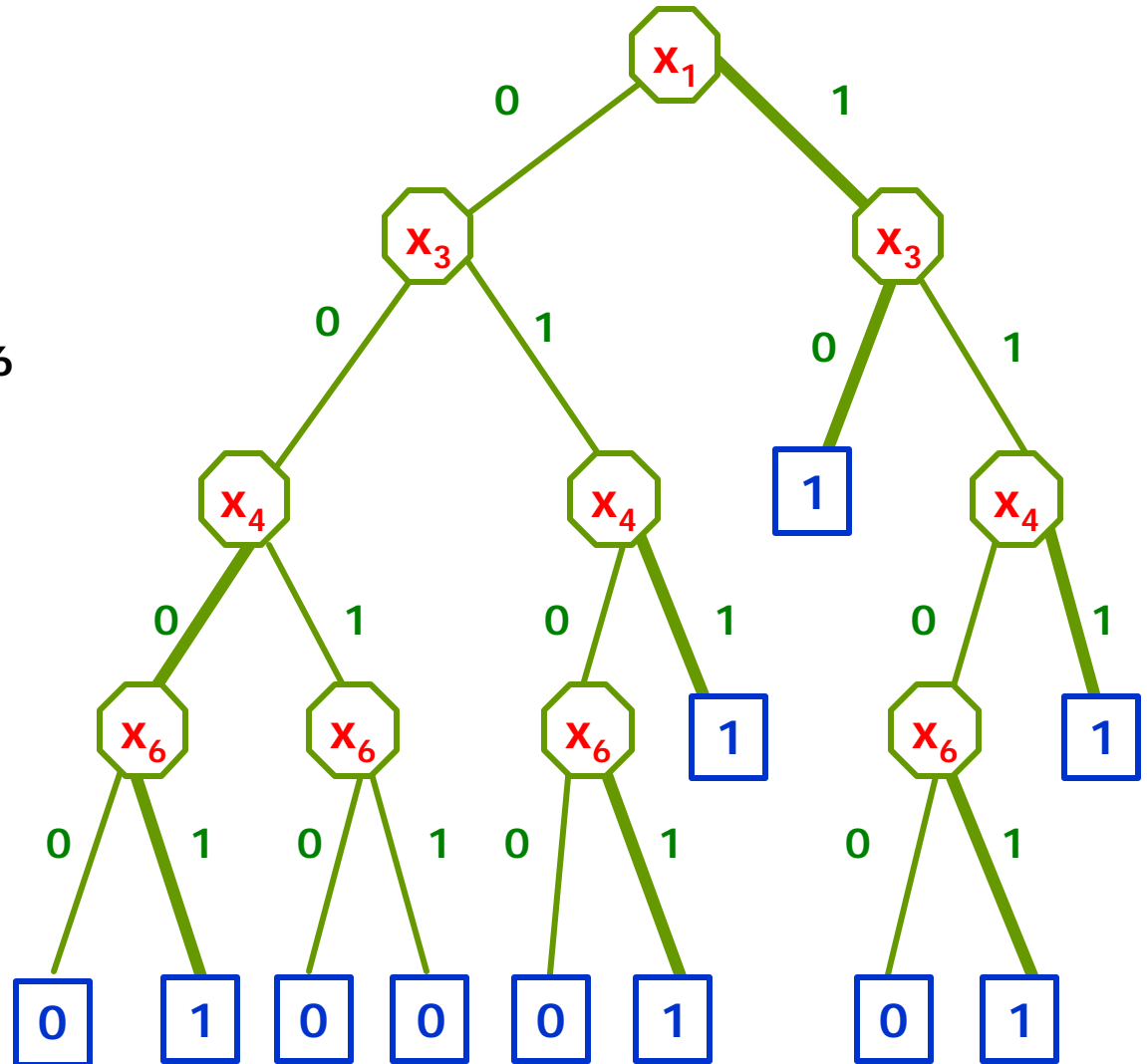
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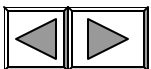
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# Parity properties

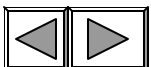
- For any restriction  $r$ ,  $\text{Parity}|_r$  is either parity or its negation on the variables that are still not assigned values
- Parity or its negation requires a decision tree of height  $n$ 
  - Compare with  $x_1 \vee \dots \vee x_n$ 
    - any decision tree also requires height  $n$
    - but most restrictions of it are constant and so only require height  $0$



# Restriction for constant-depth circuits

- An  $(S, d)$ -circuit will be an unbounded fan-in circuit of size  $\leq S$  and depth  $\leq d$
- To show that no  $(S, d)$ -circuit  $C$  computes function  $f$ , find a set  $R_{S,d}(f)$  of restrictions s.t.
  - For any  $(S, d)$ -circuit  $C$ , there is a  $r \in R_{S,d}(f)$  s.t. we can associate a **short**\* Boolean decision tree  $T(g)$  to each gate  $g$  of  $C$ , s.t.  $T(g)$  computes  $g|_r$
  - For any  $r \in R_{S,d}(f)$ ,  $f|_r$  is **not** computed by any short\* decision tree

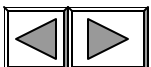
\*relative to the number of variables unset by  $r$



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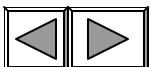
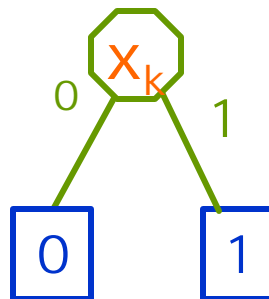
- An  $(S, d)$ -circuit will be an unbounded fan-in circuit of size  $\leq S$  and depth  $\leq d$
- To show that no  $(S, d)$ -circuit  $C$  computes function  $f$ , find a set  $R_{S,d}(f)$  of restrictions s.t.
  - For any  $(S, d)$ -circuit  $C$ , there is a  $r \in R_{S,d}(f)$  s.t. we can associate a **short\*** Boolean decision tree  $T(g)$  to each gate  $g$  of  $C$ , s.t.  $T(g)$  computes  $g|_r$
  - For any  $r \in R_{S,d}(f)$ ,  $f|_r$  is **not** computed by any short\* decision tree

\*in case of parity this just means  $<$  number of variables



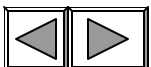
# How to find restrictions for Parity circuits

- Start at the inputs of the circuit and work upwards a layer at a time,
  - maintaining a current restriction  $r_i$  and a tree  $T_i(g)$  for each gate  $g$  in the first  $i$  layers s.t.  $T_i(g)$  computes  $g|_{r_i}$
  - For layer  $0$ , gates are input variables,  $r_0$  is empty and decision trees have height 1



# How to find restrictions for Parity circuits

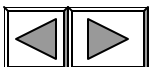
- Working up the layers of the circuit
  - If  $h = \emptyset g$  then let  $T_i(h)$  be  $T_i(g)$  with its leaf labels toggled between **0** and **1**.
  - If  $h = (g_1 \dot{\cup} \dots \dot{\cup} g_t)$  then the function  $h|_{r_i}$  may require tall decision trees even if all  $T_i(g_j)$  are short
    - so we look for a further small restriction  $\pi$  to the inputs in the hopes of simplifying  $h|_{r_i}$  so that the tree will be short
    - We'd like to choose **one**  $p$  that simultaneously does this for **all** the unbounded fan-in  $V$ 's in this layer (up to **S** of them!)





# What will we do once we have $\pi$

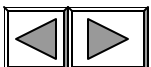
- Once we have such a restriction  $\pi$  - a tall order it seems
  - Set  $r_{i+1} = r_i p$
  - Short  $T_{i+1}(h)$  for  $h$  in this layer exist by our assumed properties of  $p$
  - For all gates  $g$  below this layer, set  $T_{i+1}(g) = T_i(g) | p$
  - continue upward...
- We end by letting  $r = r_d$  and we will have chosen the various  $p$  so that the trees will be shorter than the number of inputs that  $r$  leaves unset
  - circuit cannot compute parity



# Finding $\pi$

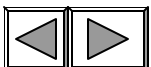
## ■ Probabilistic method

- Show that a randomly chosen small  $p$  fails to shorten the decision tree for any single V-gate  $h$  in this layer with probability  $< 1/S$
- There are at most  $S$  V-gates in this layer, so  $\Pr[\$an V-gate in this layer not shortened by  $p$ ]  $< 1$$
- ...so there must exist a small  $p$  that does the job
  - choose it



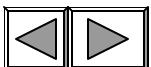
# Hastad's Switching Lemma

- Let  $R_{k,n}$  be the set of all restrictions to variables  $x_1, \dots, x_n$  that leave precisely  $k$  variables unset
- **Lemma:** Given a DNF formula  $F$  in variables  $x_1, \dots, x_n$  with terms of size at most  $t$ , for  $p$  chosen uniformly at random from  $R_{k,n}$ , if  $n > 12tk$  then  
Pr[canonical decision tree for  $F|_p$  has height  $\leq t$ ]  $< 2^{-t}$ .



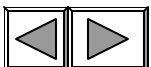
# Final analysis

- Maintain trees of height  $t = \log_2 S$
- Number of variables decreases by a factor of  $13t = 13 \log_2 S$  per layer
- Height will be less than # of variables if  $\log_2 S < n / (13 \log_2 S)^d$  i.e.  $\log_2 S < n^{1/(d+1)} / 13$ 
  - can't compute parity if this holds
- Can save one power of  $\log_2 S$  by being careful



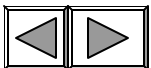
# Restriction method in proof complexity

- **Theorem** [Ajtai,PBI ,KPW]:  $\text{ontoPHP}^{n+1} \textcircled{R} n$  requires exponential size  $\text{AC}^0\text{-Frege}$  proofs
- **Theorem** [Ajtai,BP]  $\text{Count}^{2n+1|2}$  requires exponential size  $\text{AC}^0\text{-Frege}$  proofs even given  $\text{PHP}^{m+1} \textcircled{R} m$  as extra axiom schemas
- **Theorem** [BI KPP]  $\text{Count}^{pn+1|p}$  requires exponential size proofs even given  $\text{Count}^{qm+1|q}$  as axiom schemas



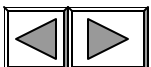
# Restrictions in Proof Complexity

- In circuit complexity,
  - for each gate  $g$  we defined decision trees  $T(g)$  that precisely compute each  $g|_r$  in the circuit
- Obvious analogue in proof complexity, e.g. in proof of a tautology
  - do the same
- But this can't work
  - every formula in the proof computes the constant function 1 since it is a tautology!



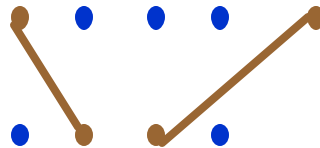
# What we do instead

- Come up with a different notion of decision trees that **approximates** each formula so that
  - bigger proof needed for a tautology implies worse approximation of it
  - decision trees are well-behaved under restrictions
  - approximation is particularly bad for the goal formula **F** you want to prove
    - Any short approximating decision tree for
      - **F** looks like **false**
      - an axiom looks like **true**
      - any formula with a short proof looks like **true**
  - like circuit case define decision trees for **each subformula** in the proof and tailor decision trees & restrictions to **F**

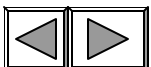


# Restrictions for $\text{PHP}^{n+1 \rightarrow n}$

- Don't want restrictions to force  $\text{PHP}^{n+1 \rightarrow n}$  to true so...
- Restrictions  $p$  are partial matchings as before



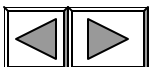
- Let  $R^{k,n}$  be the set of all partial matching restrictions that leave exactly  $k$  holes unset



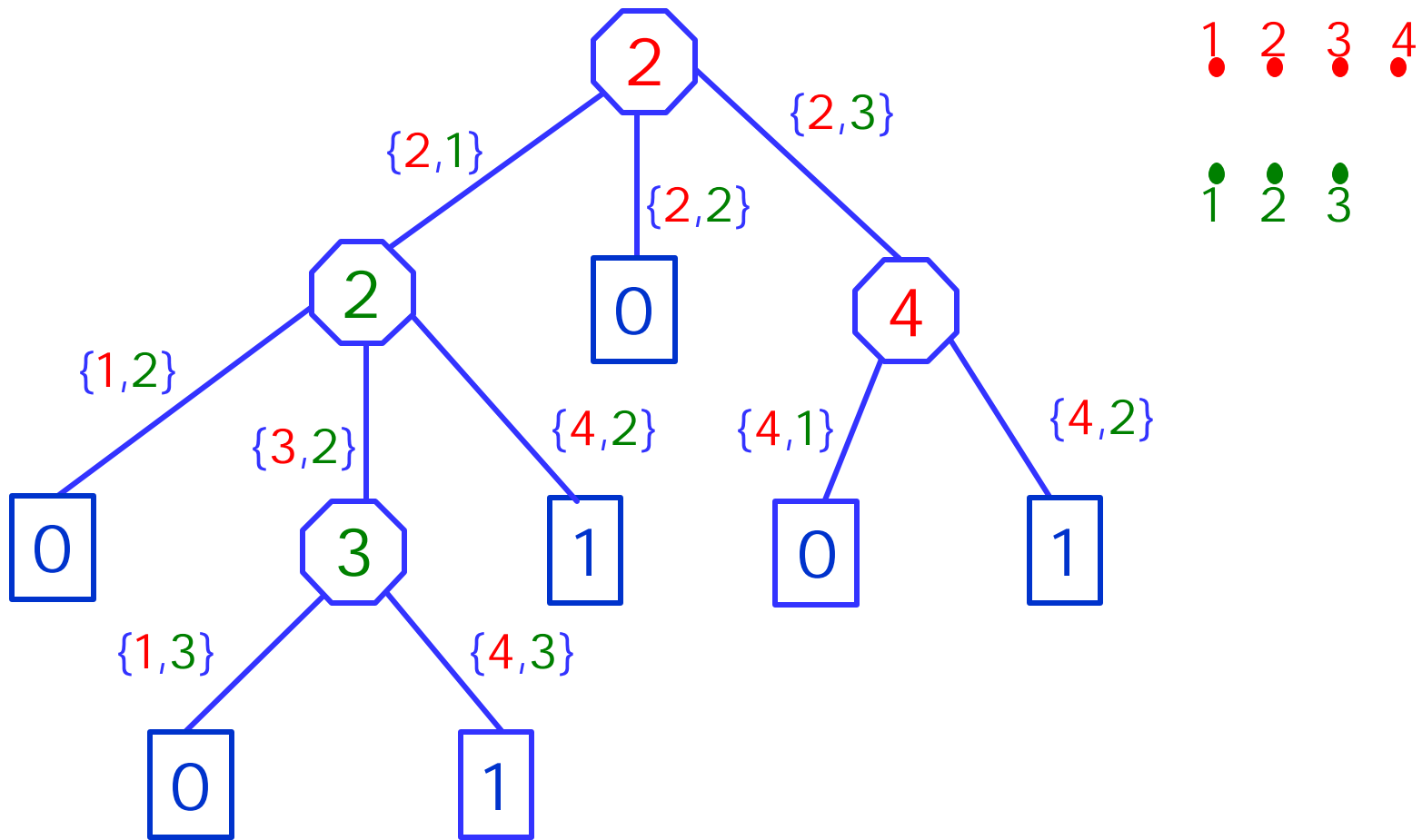


# Bipartite matching decision trees

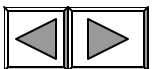
- Queries are either
  - the name of a pigeon, or
    - answer is the mapping edge for that pigeon
  - the name of a hole, or
    - answer is the mapping edge for that hole
- Every path corresponds to a partial matching between pigeons and holes
  - No repetition of a node name that was already used higher in the tree
- Leaves are labelled 0 or 1



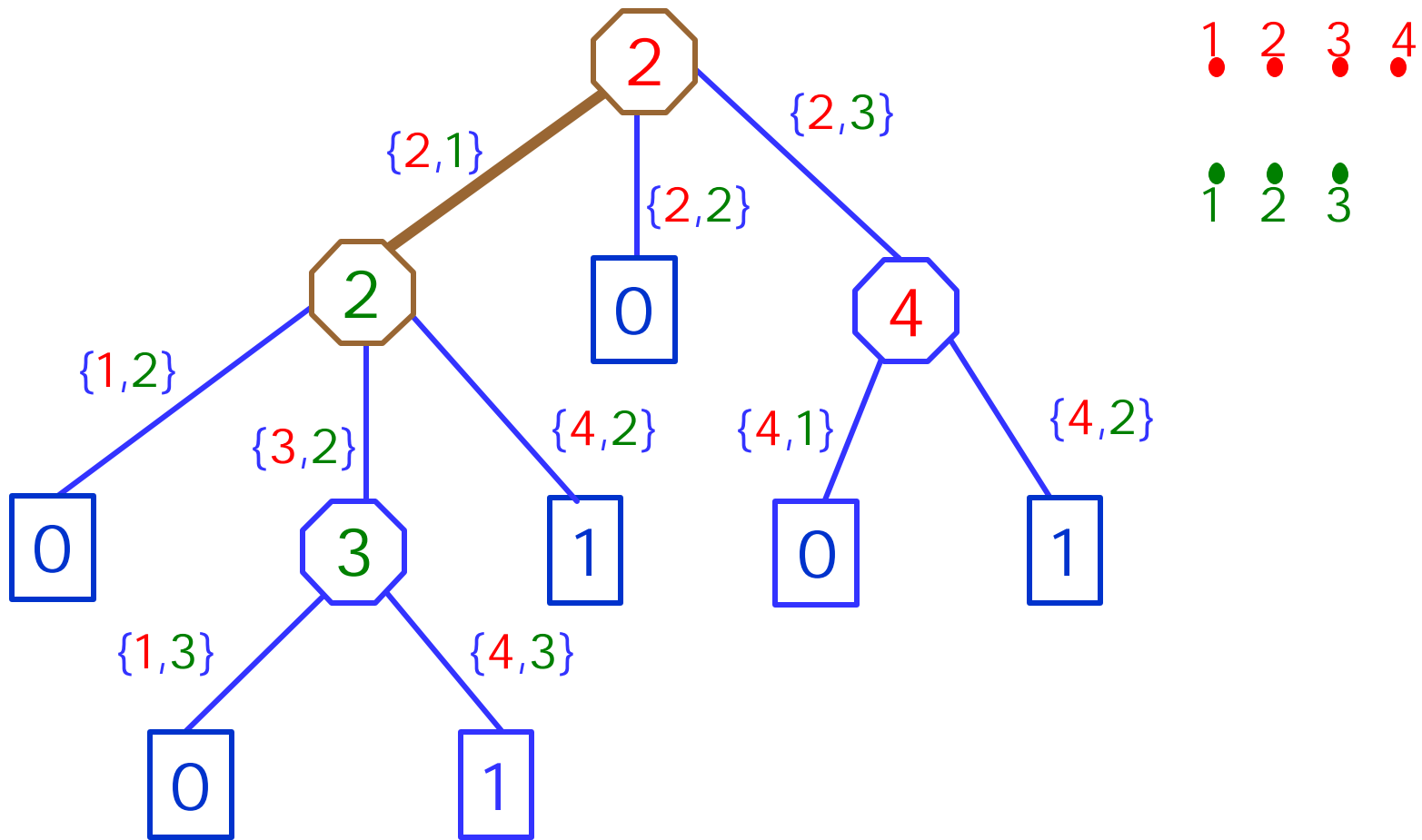
# A matching decision tree



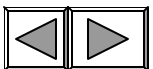
$$P_{21}P_{32}P_{43} \vee P_{21}P_{42} \vee P_{23}P_{42}$$



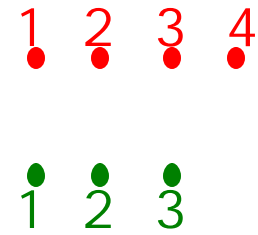
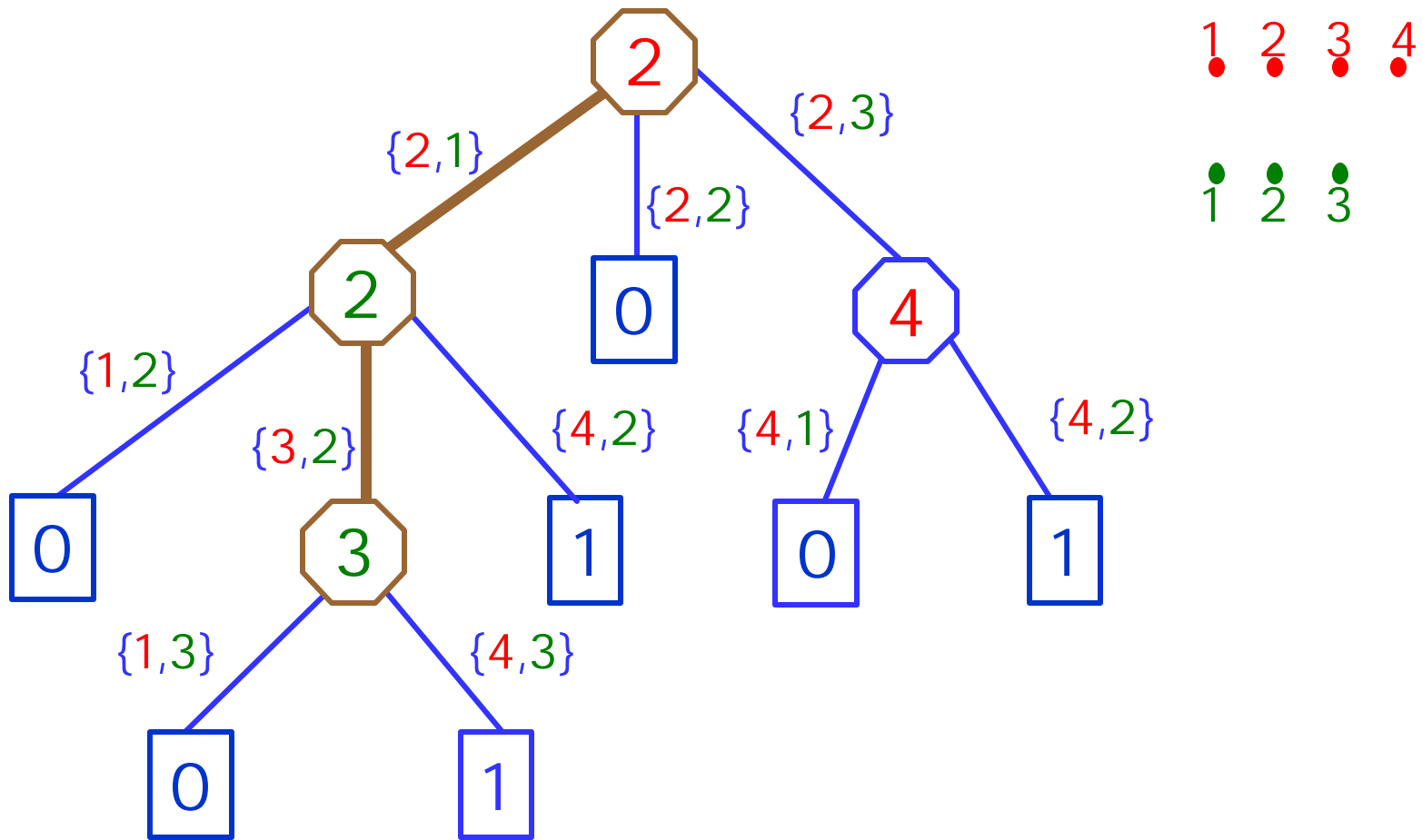
# A matching decision tree



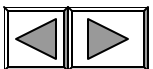
$$P_{21}P_{32}P_{43} \vee P_{21}P_{42} \vee P_{23}P_{42}$$



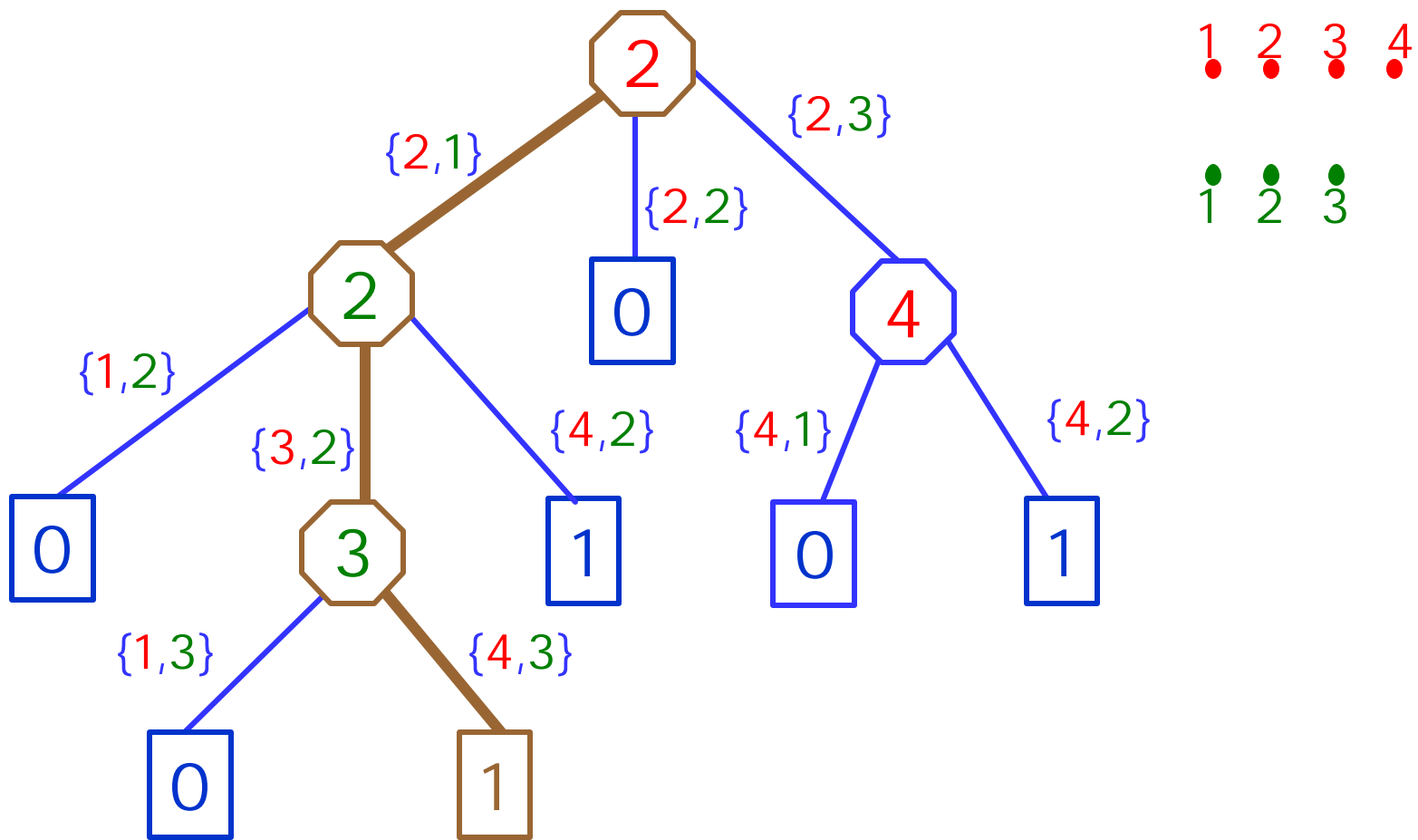
# A matching decision tree



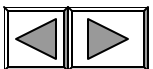
$$P_{21}P_{32}P_{43} \vee P_{21}P_{42} \vee P_{23}P_{42}$$



# A matching decision tree

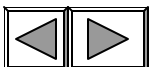


$$P_{21}P_{32}P_{43} \vee P_{21}P_{42} \vee P_{23}P_{42}$$



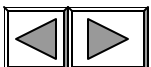
# Associating matching trees with formulas

- $T(P_{ij})$  queries  $i$  & has height  $1$
- $T(\emptyset g)$  is  $T(g)$  with leaf labels toggled
- To get tree for  $h=(g_1 \dot{\cup} \dots \dot{\cup} g_t)$ 
  - take DNF formula  $F_h=T(g_1)\dot{\cup} \dots \dot{\cup} T(g_t)$
  - do **canonical conversion** of  $F_h$  into a matching decision tree
    - like conversion for ordinary decision trees
      - go term by term left-to-right simplifying future terms based on partial assignments
      - query both endpoints of every variable in each term



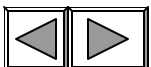
# I deas for $\text{PHP}^{n+1 \rightarrow n}$ lower bound

- Restrictions are kind to matching decision trees
  - Analog of Hastad switching lemma for canonical conversion of DNF to matching decision trees
  - If proof is small trees can be made short
- Matching decision trees of height  $< n$ 
  - for  $\text{PHP}^{n+1 \rightarrow n}$  has all 0's on its leaves
  - for an axiom has all 1's on it leaves
  - preserve this property of all 1's on the leaves under inference rules



# Extensions to extra axioms

- Same sorts of restrictions and decision trees
- Must also prove that extra axioms convert to trees with all 1's on their leaves
  - Surprisingly, this follows in each case from Nullstellensatz degree lower bounds for the extra axioms!





# The Frontier

