

# On Compiling CNFs into Structured Deterministic DNNFs

Friedrich Slivovsky

joint work with Simone Bova, Florent Capelli, and Stefan Mengel



# Model Counting (#SAT)

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**structural restrictions** often yield tractability

## Previous talk:

exact model counters implicitly compile CNFs  
into **decision** DNNFs

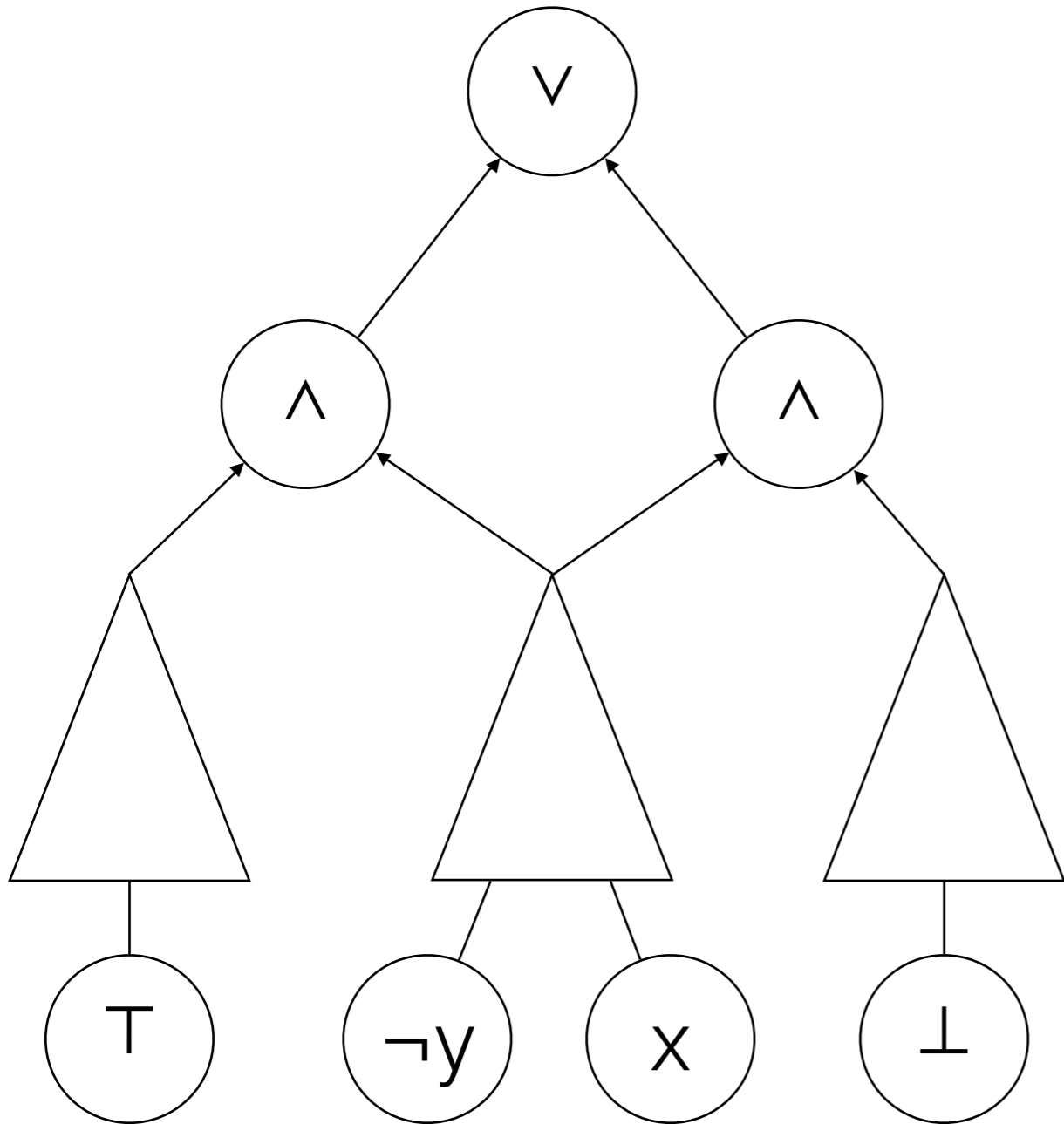
## **Previous talk:**

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## **This talk:**

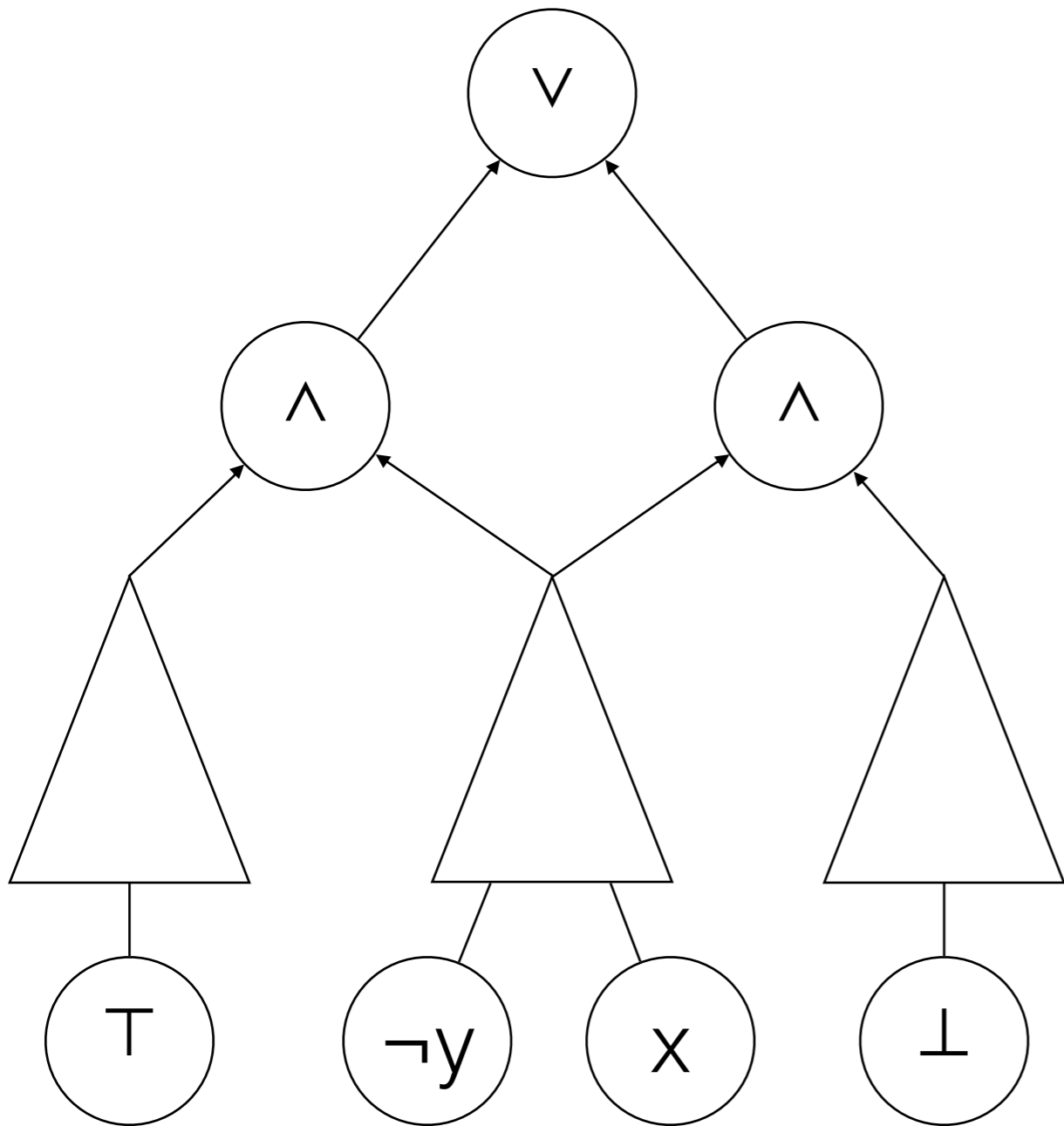
compilation of CNFs into **structured deterministic** DNNFs based on new model counting algorithms

# deterministic DNNF



# deterministic DNNF

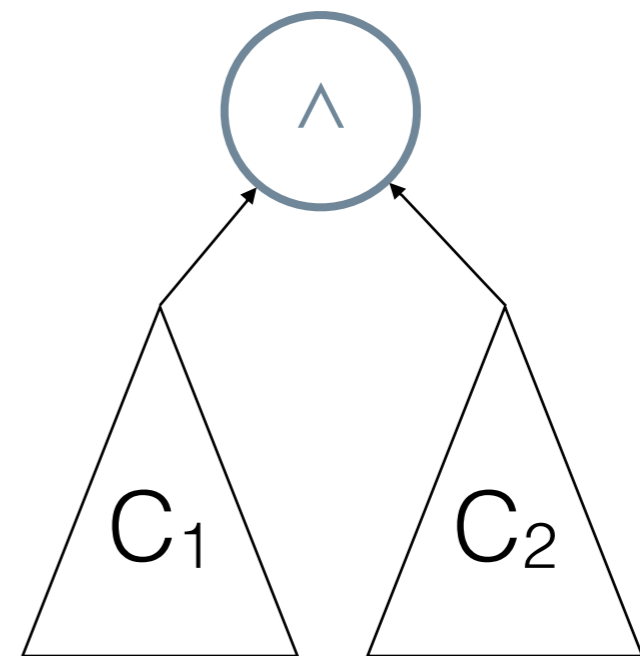
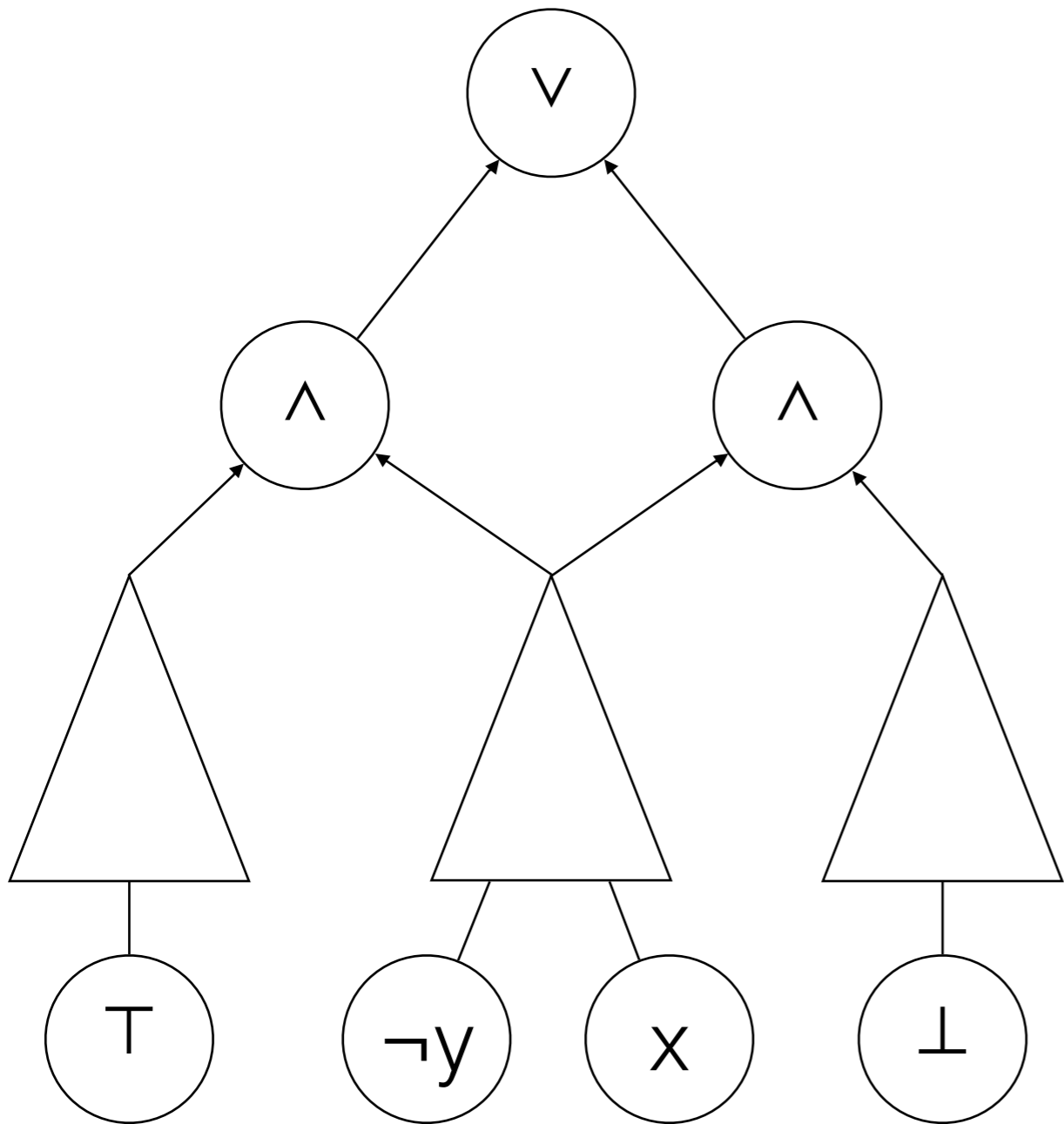
**decomposable**



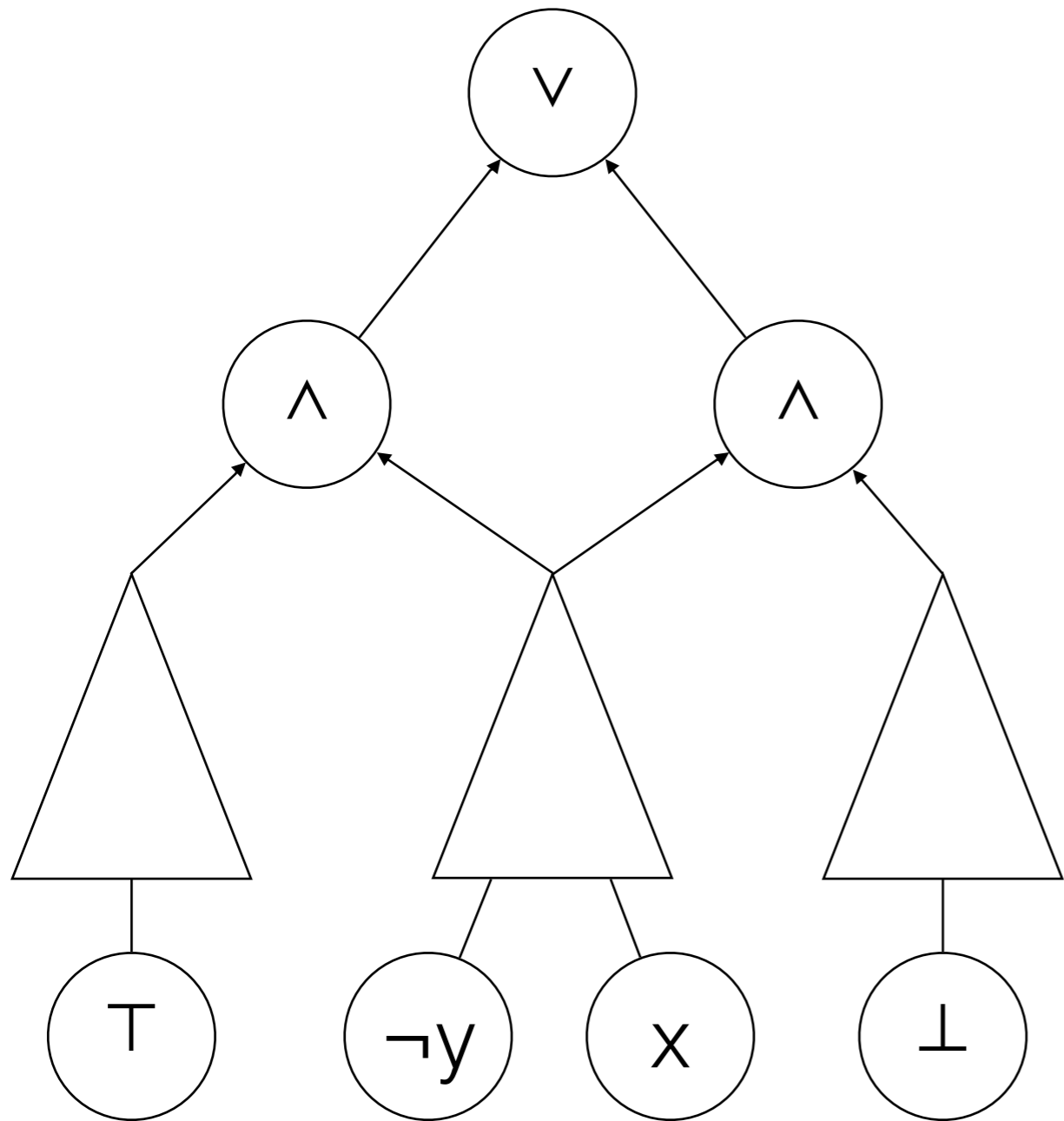


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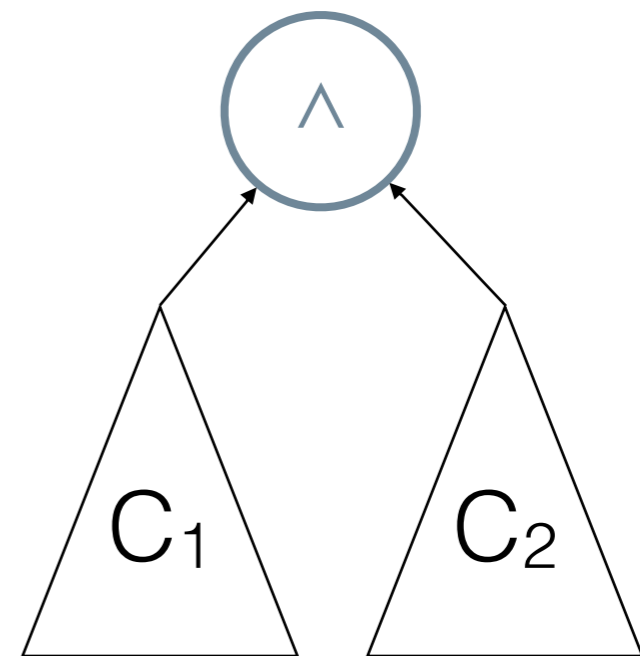
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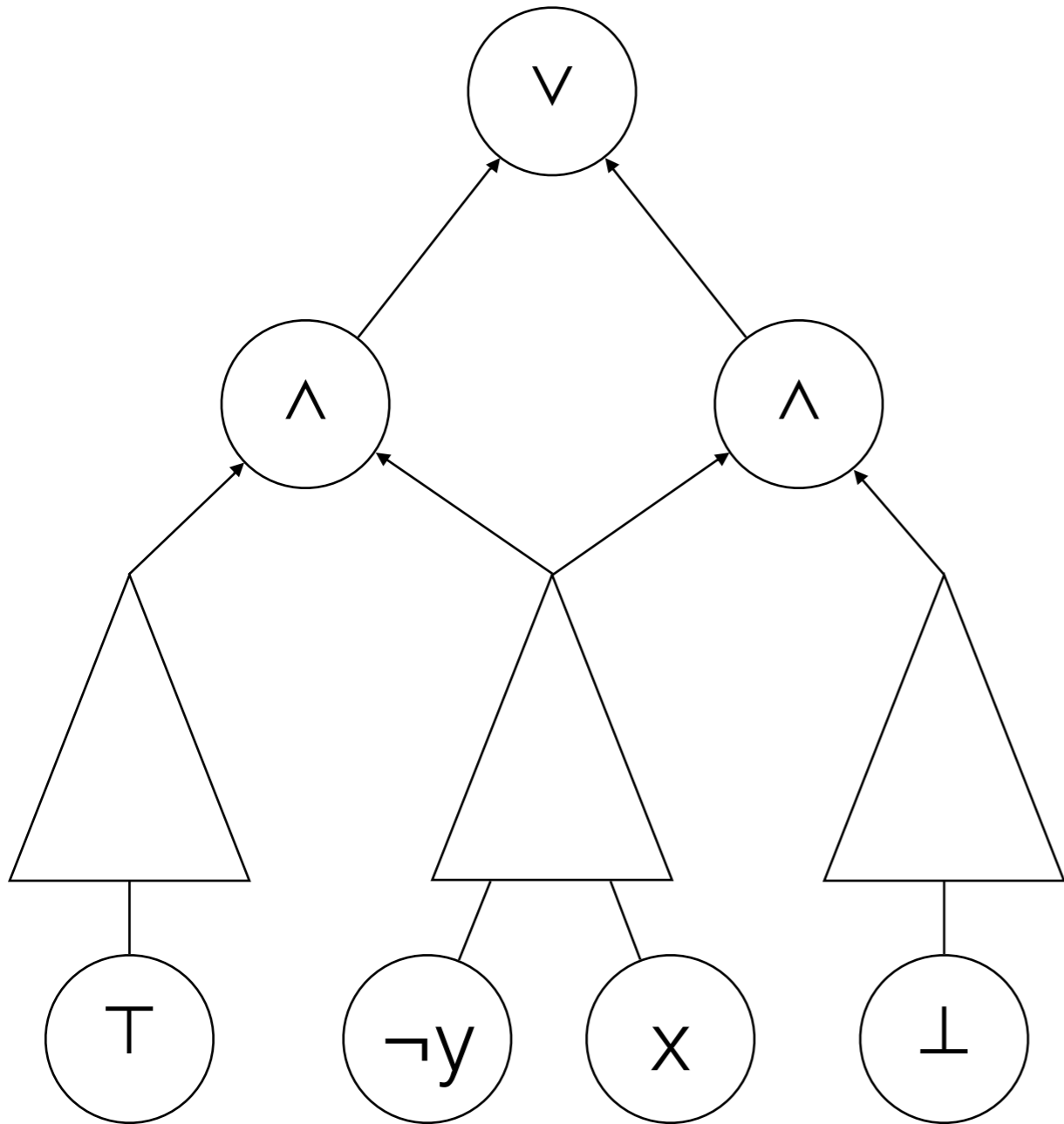
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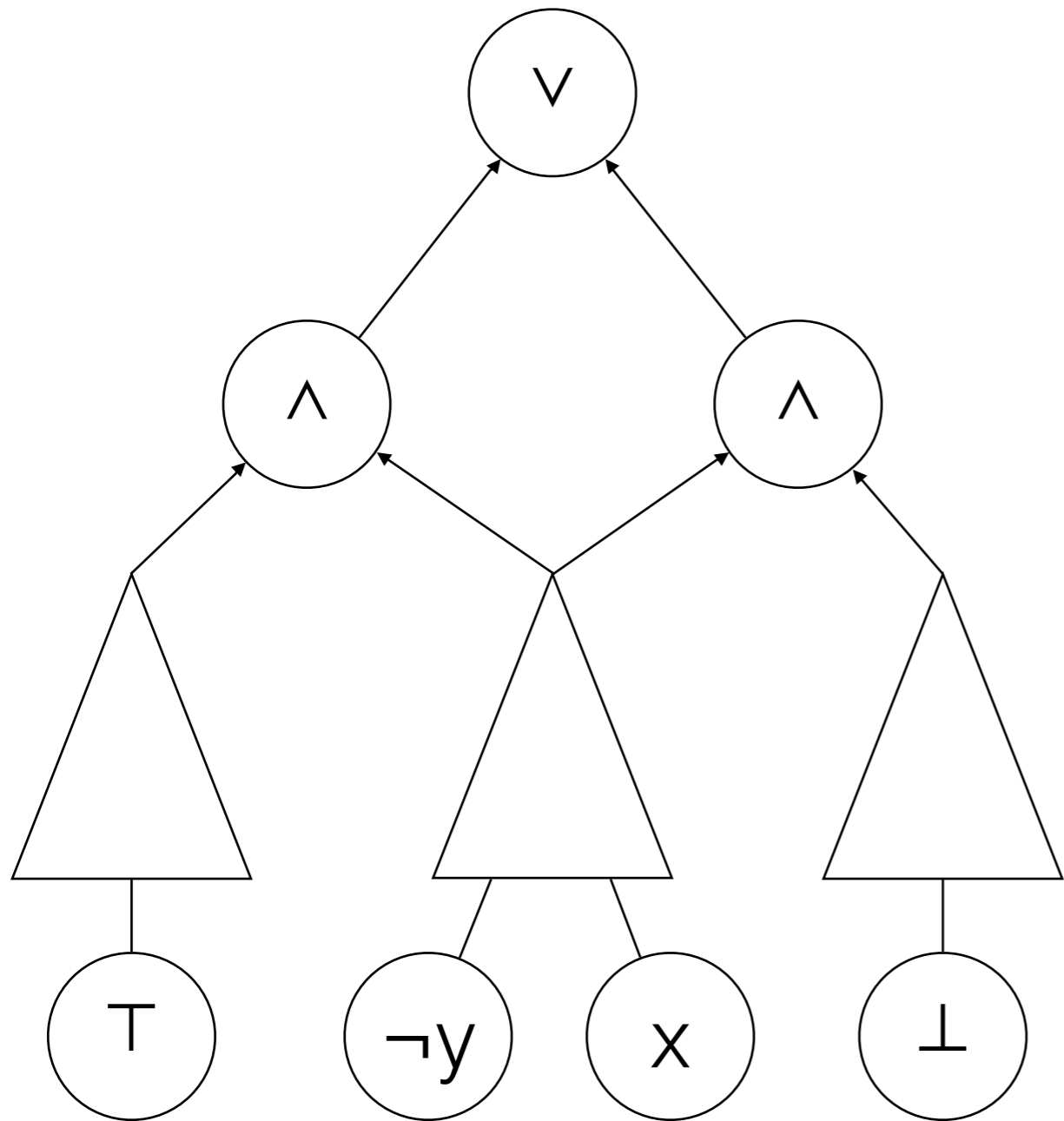
$$\text{var}(C_1) \cap \text{var}(C_2) = \emptyset$$

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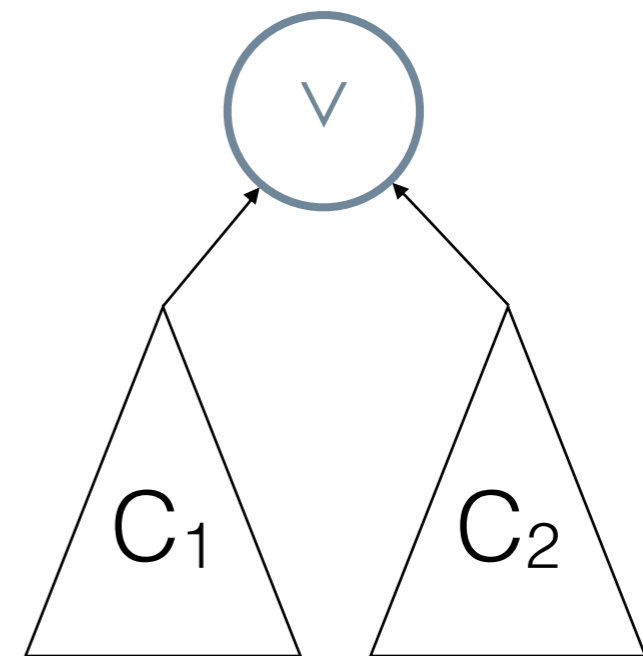
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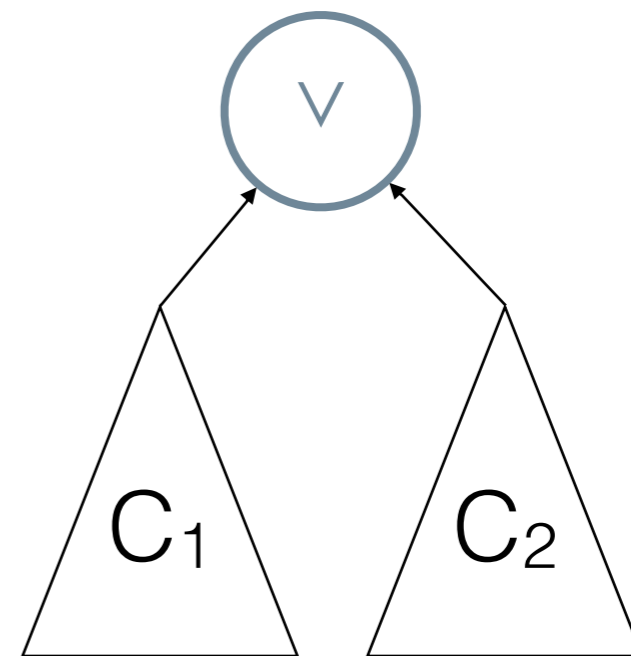
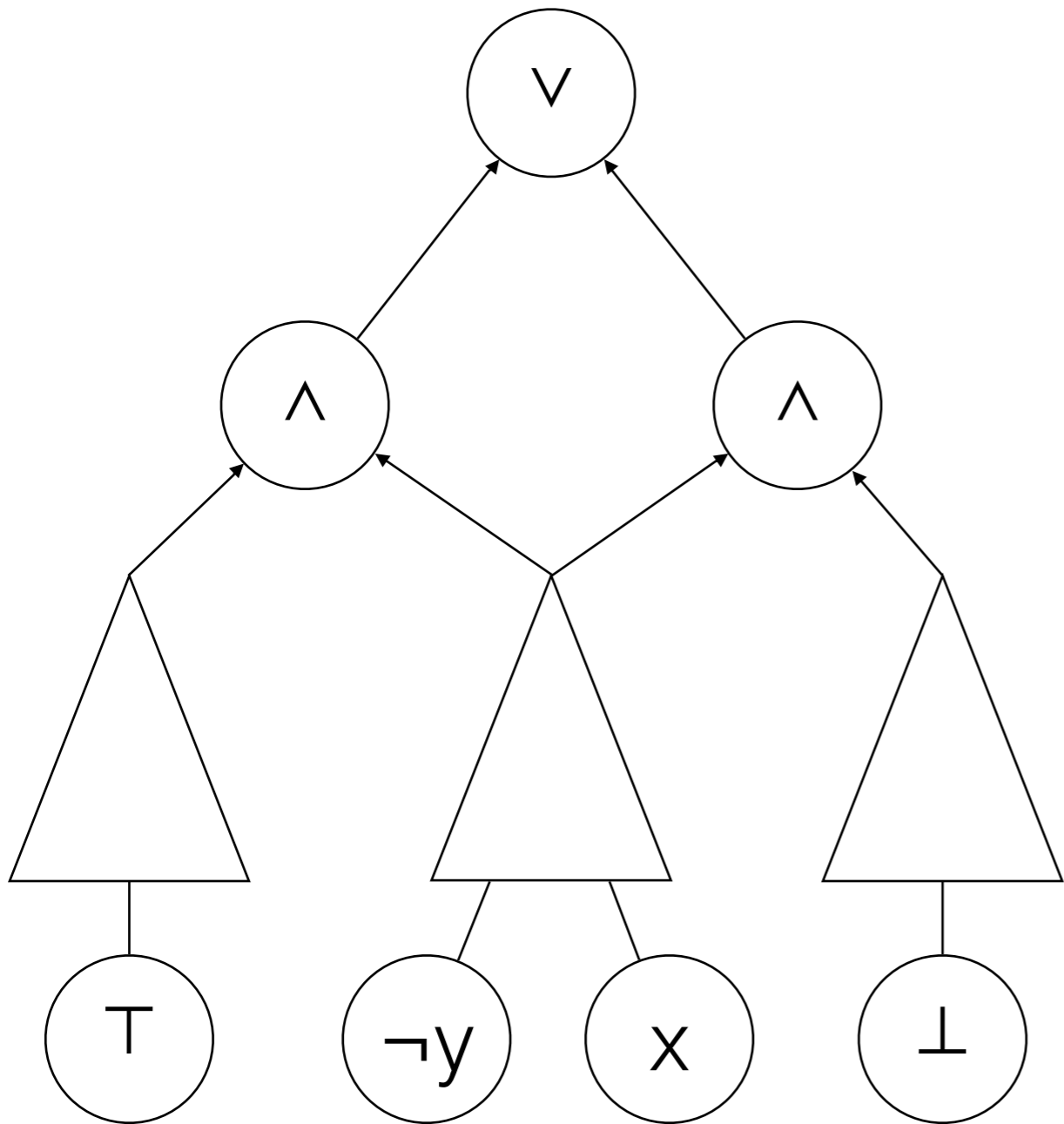


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CNFs are not **polysize compilable** into DNNFs

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**unless PH collapses**

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this can be proved **unconditionally**

(Bova, Capelli, Mengel, S. 2014)



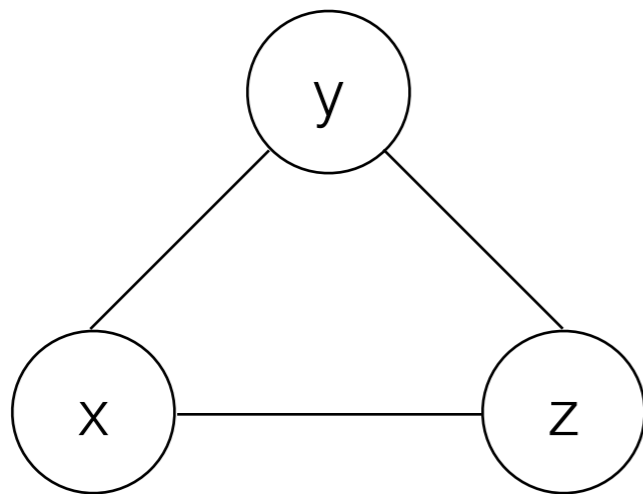
# Structural Parameters

$$(x \vee \neg y \vee z) \wedge (\neg x \vee \neg z) \wedge (y \vee z)$$

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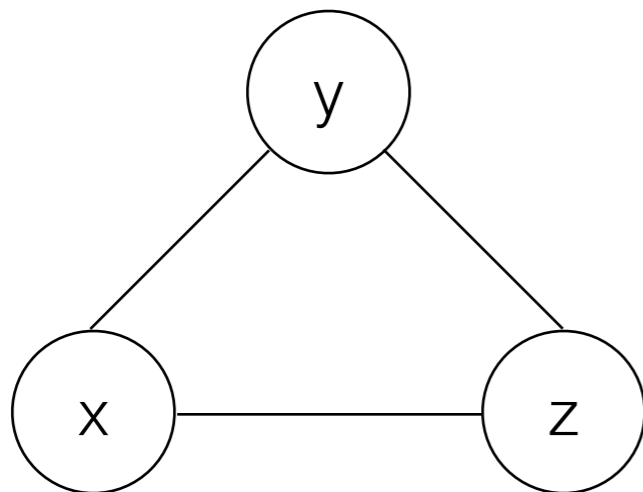
**primal graph**



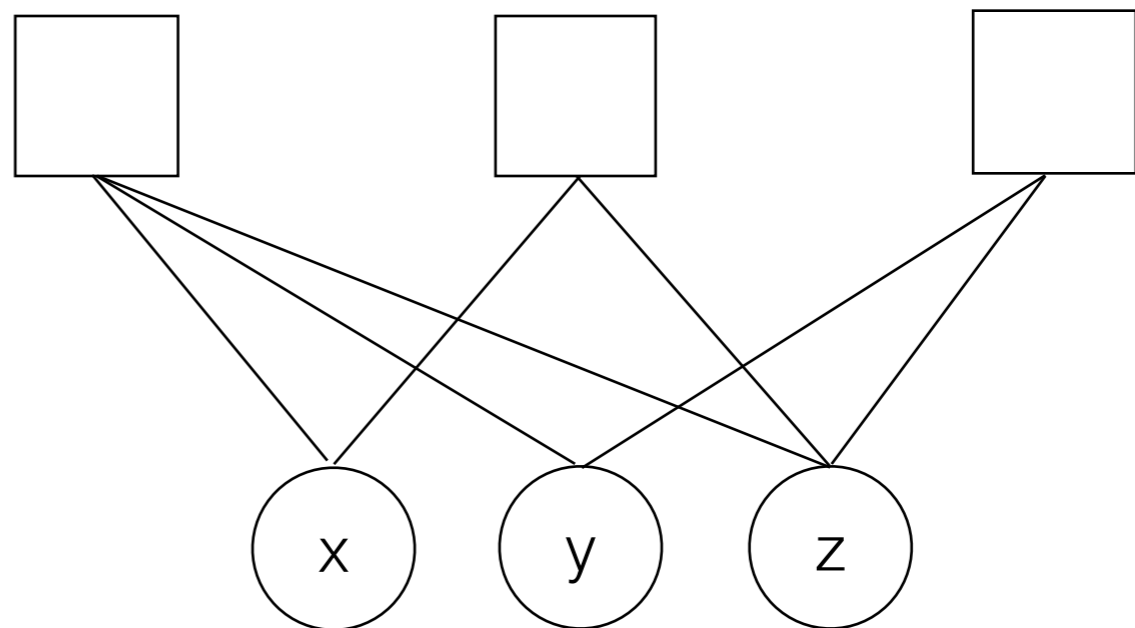
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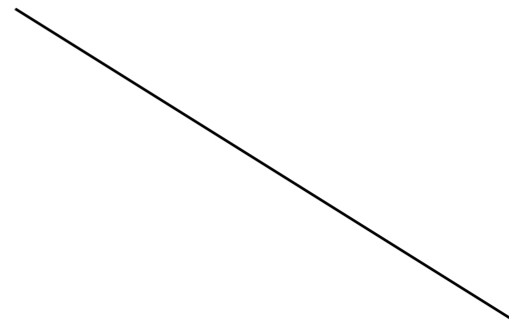
**primal graph**



**incidence graph**

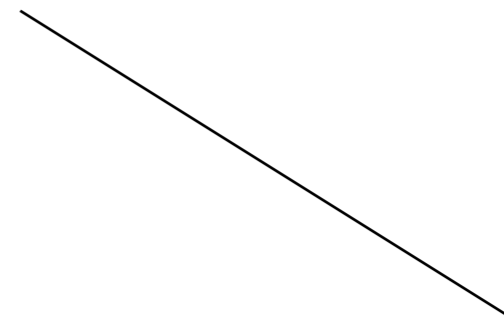


incidence treewidth



primal treewidth

incidence treewidth



primal treewidth

**decision**

$2^{kn}$

incidence treewidth

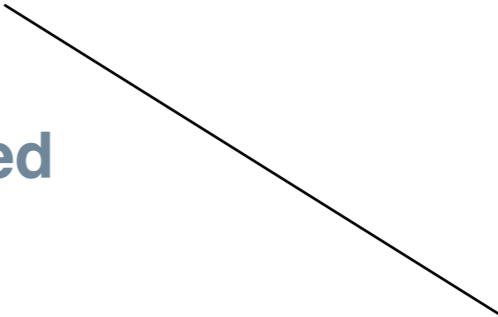
**structured**

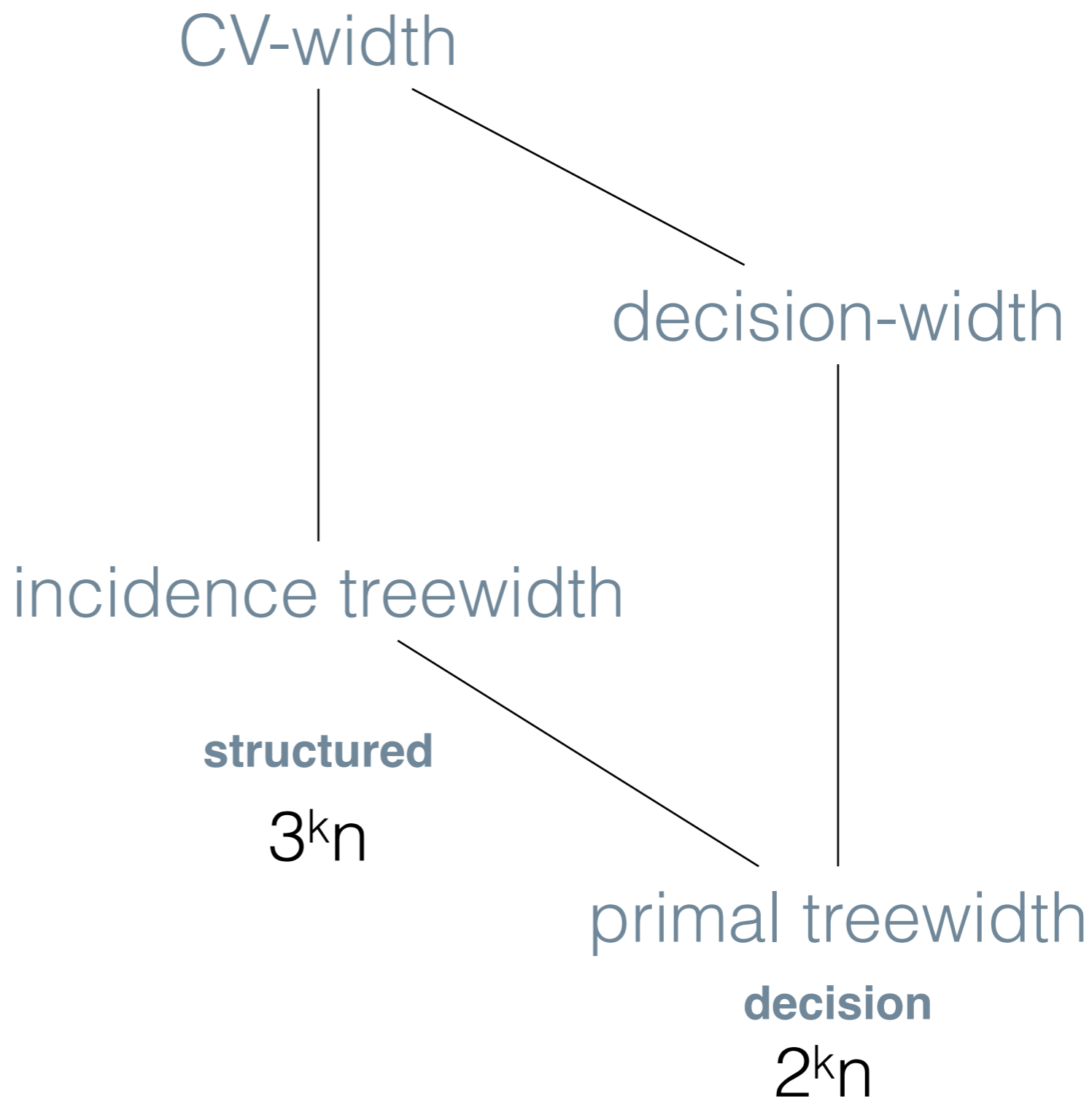
$$3^k n$$

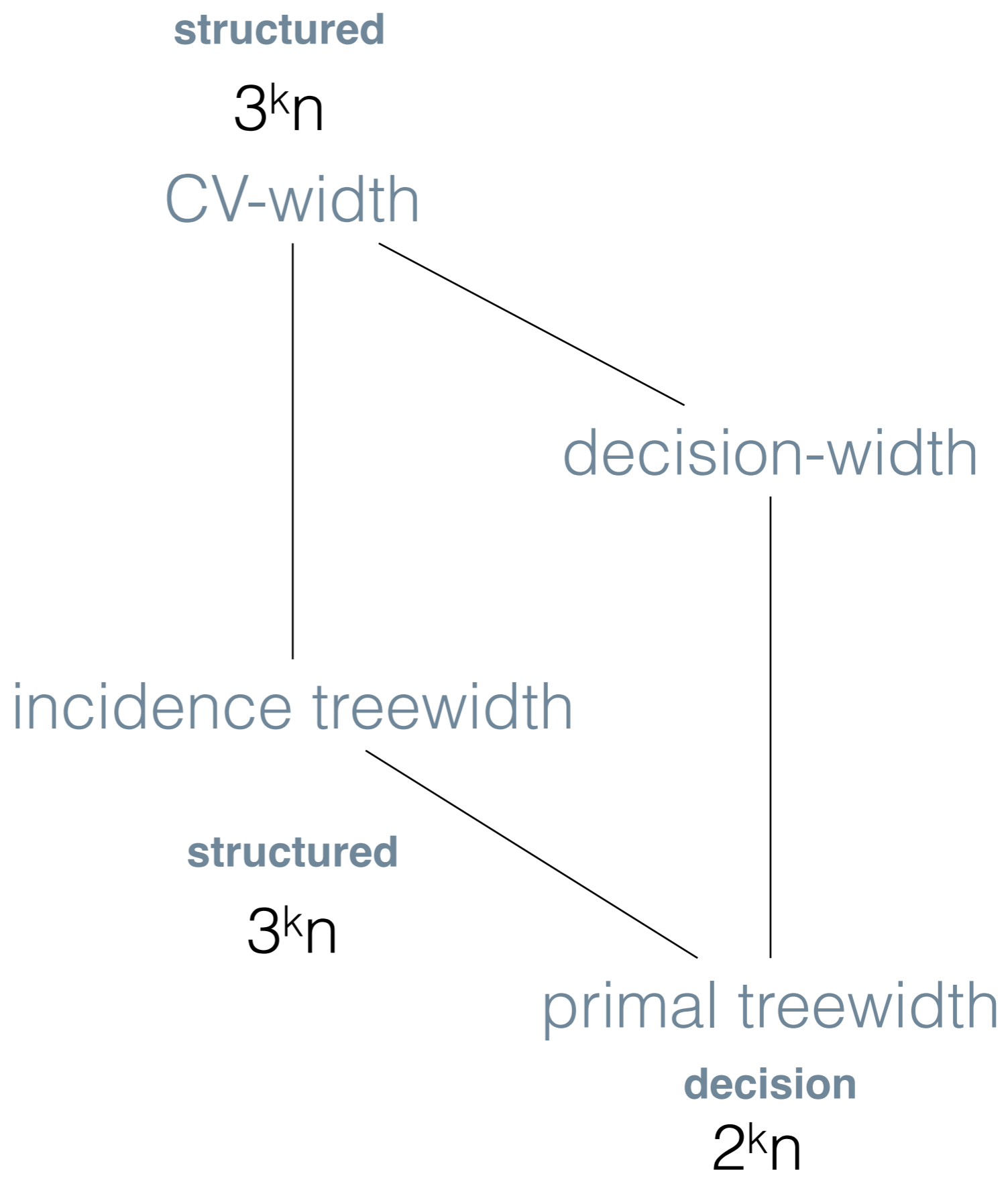
primal treewidth

**decision**

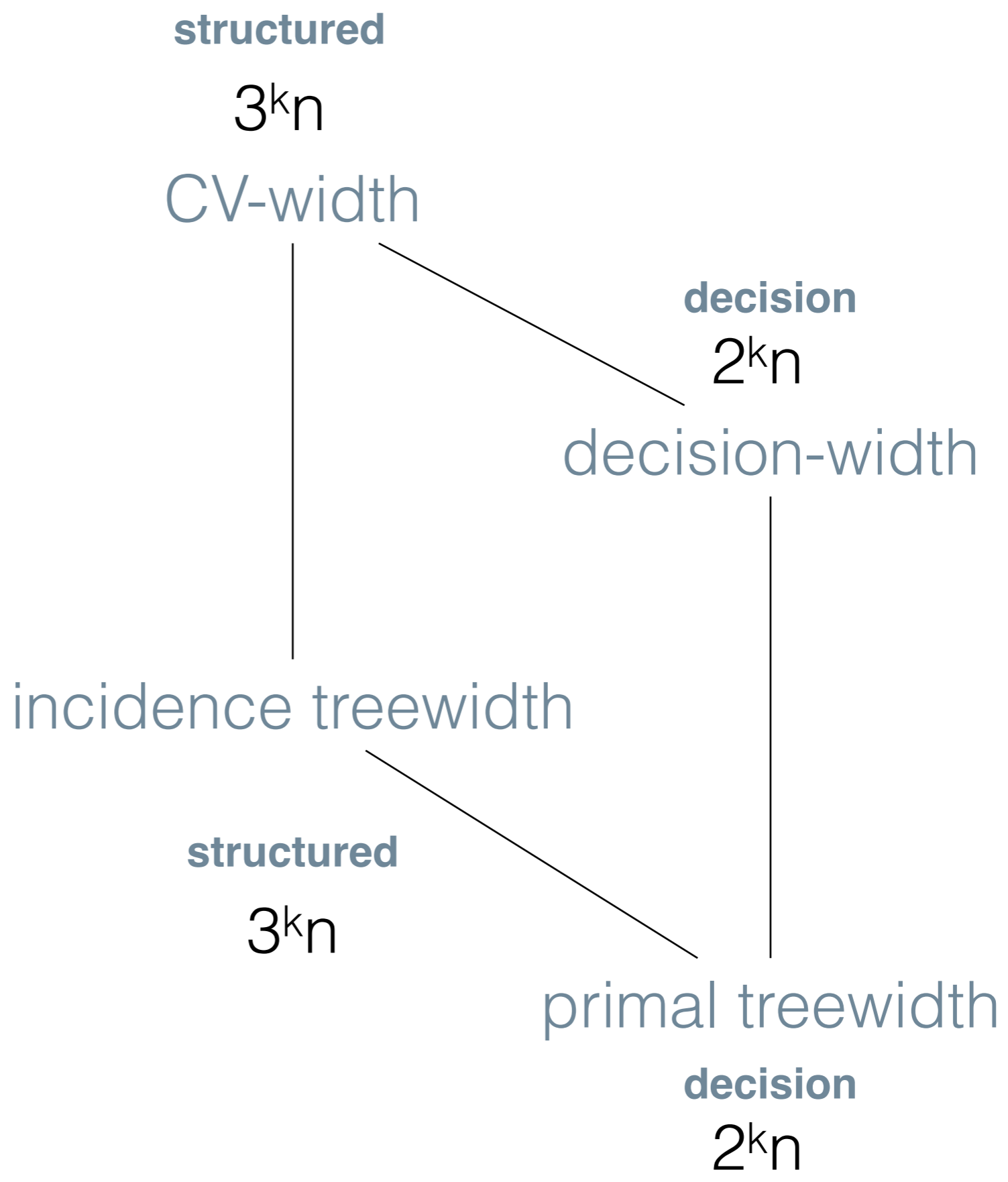
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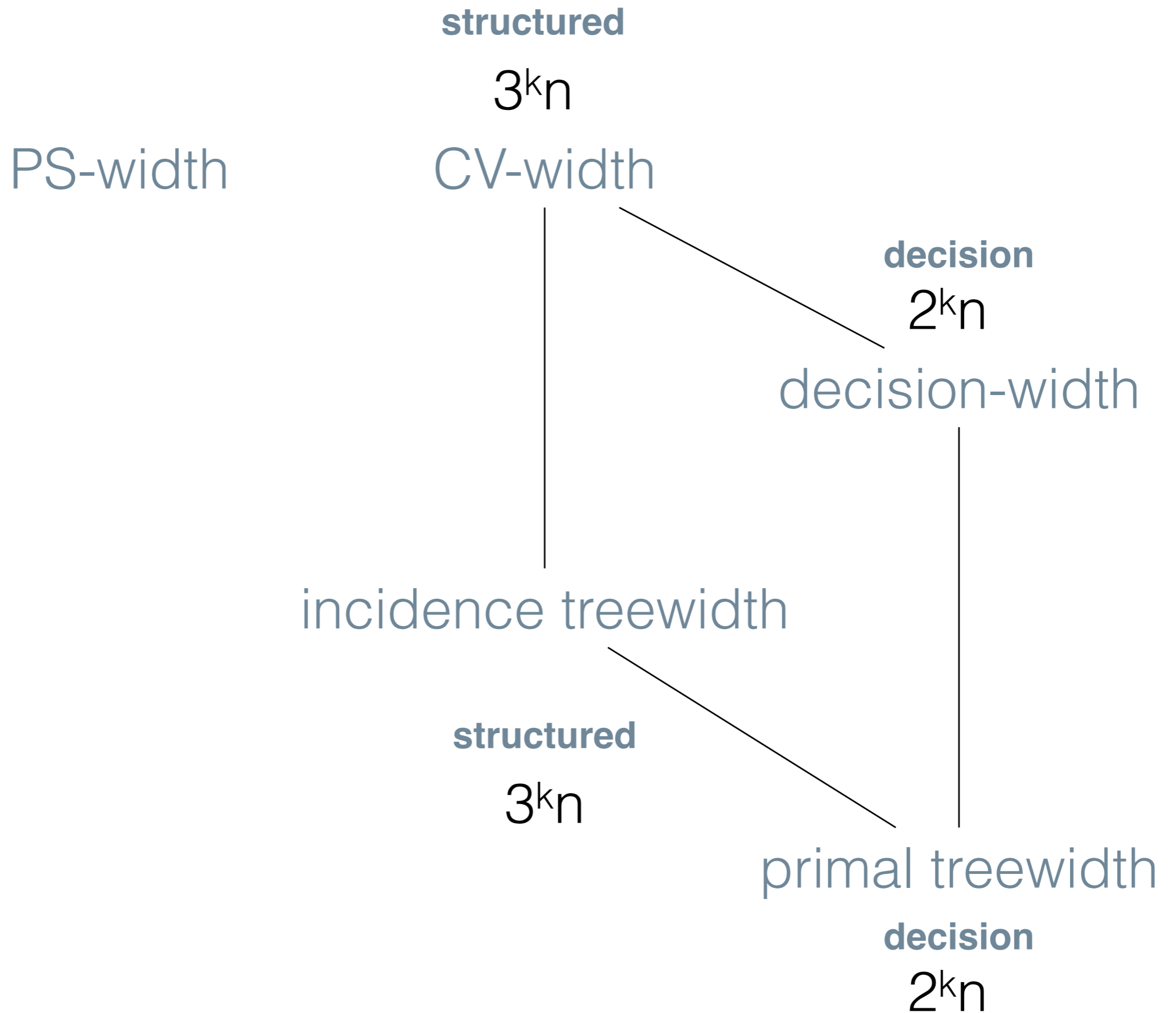












**structured  
deterministic**  
 $k^3 (n+m)$   
PS-width

**structured**  
 $3^{kn}$   
CV-width

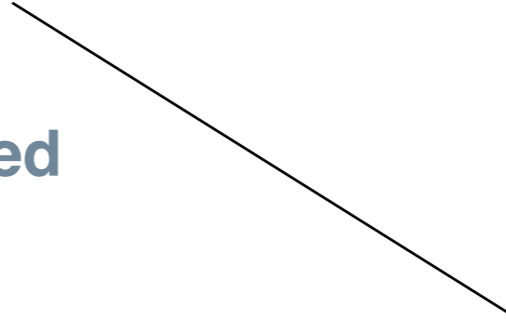
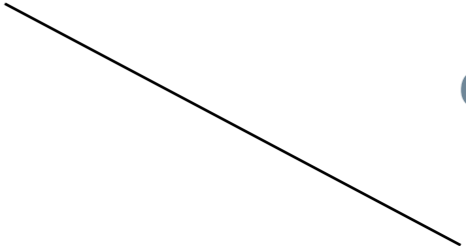
**decision**  
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decision-width

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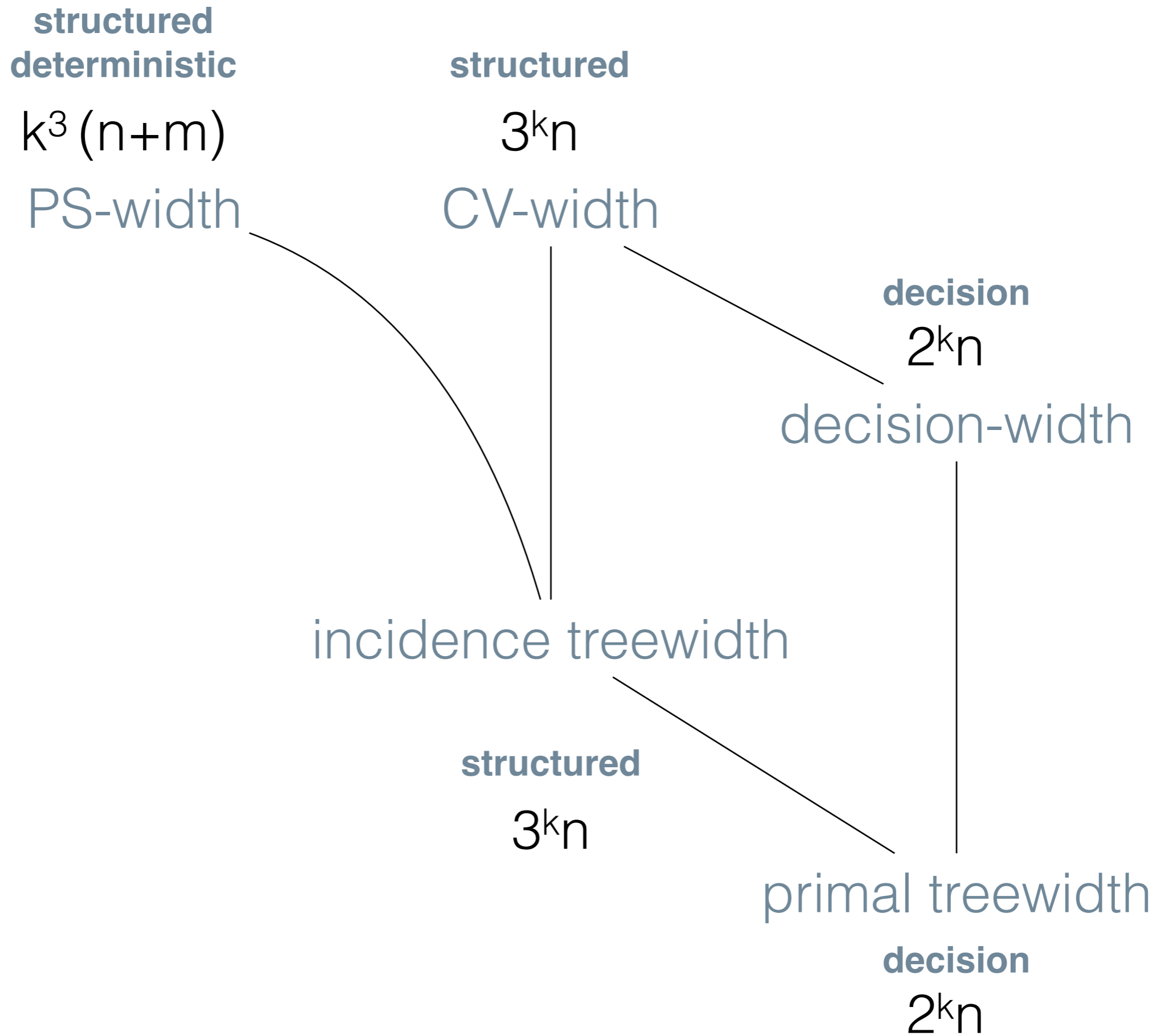
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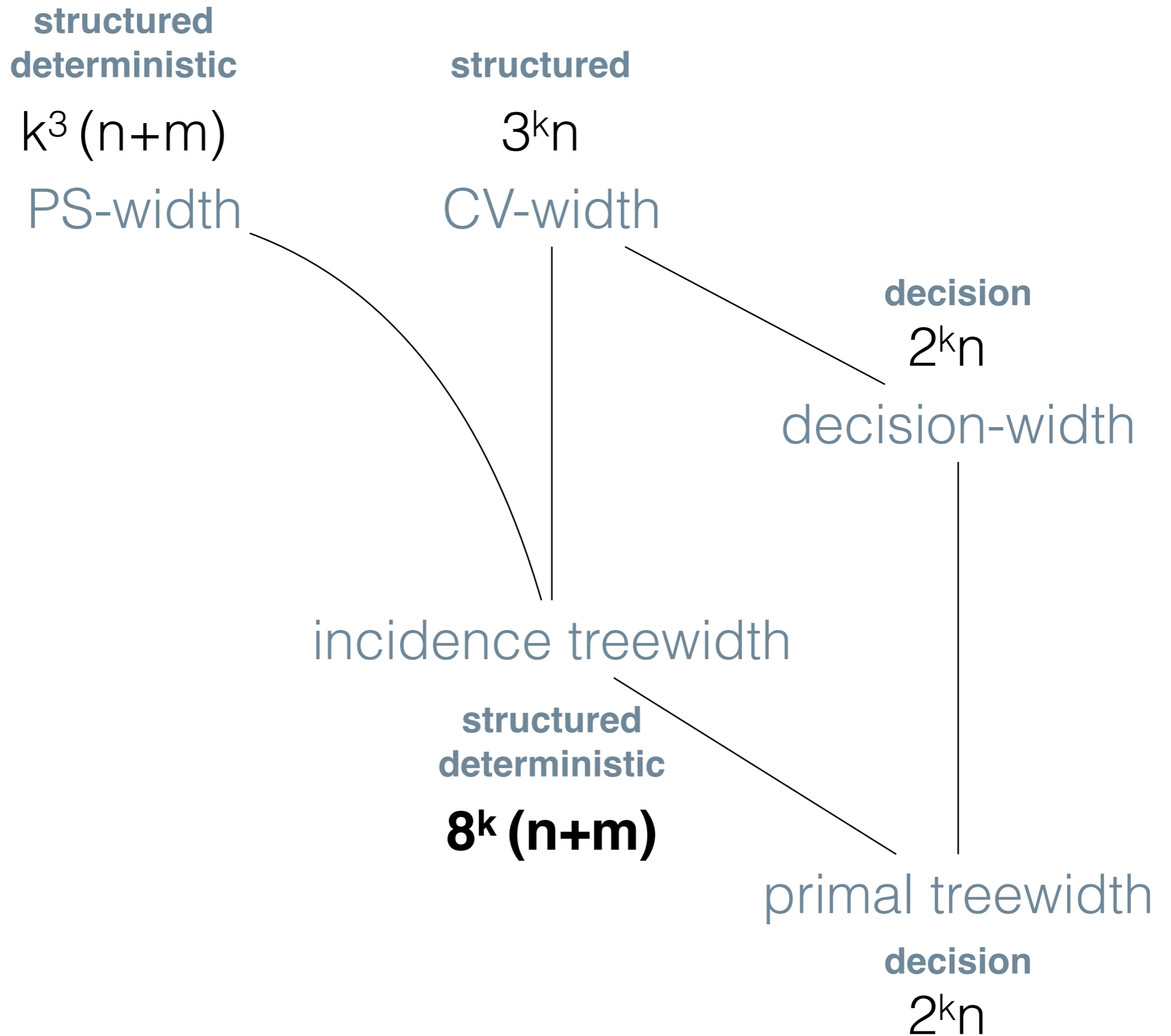
**structured  
deterministic**

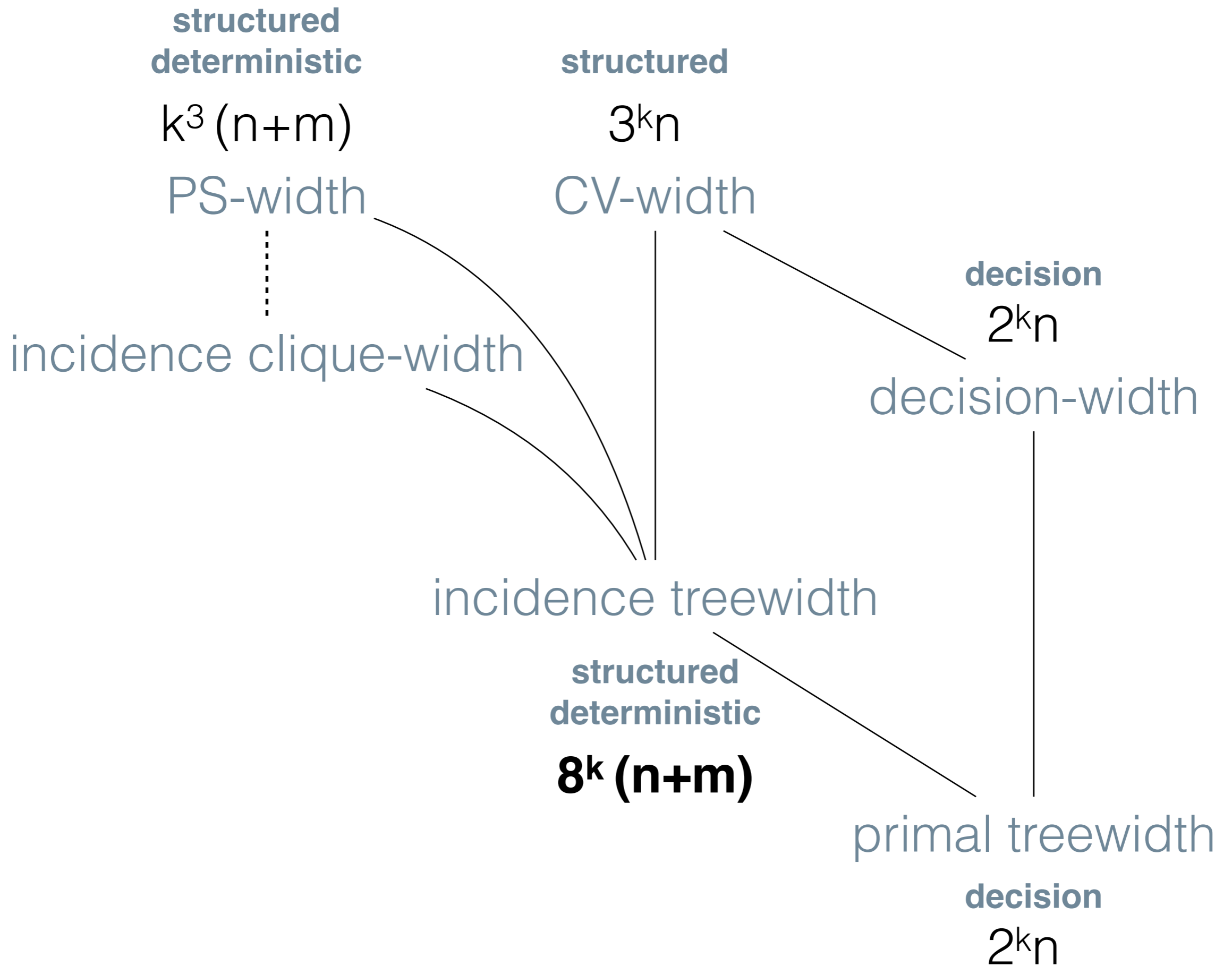
**$8^k (n+m)$**

primal treewidth

**decision**

$2^{kn}$





**structured  
deterministic**

$$k^3 (n+m)$$

PS-width



incidence clique-width

**structured  
deterministic**

$$m^{3k} (n+m)$$

**structured**

$$3^kn$$

CV-width

**decision**

$$2^kn$$

decision-width

incidence treewidth

**structured  
deterministic**

$$8^k (n+m)$$

primal treewidth

**decision**

$$2^kn$$



# The Compilation Algorithm

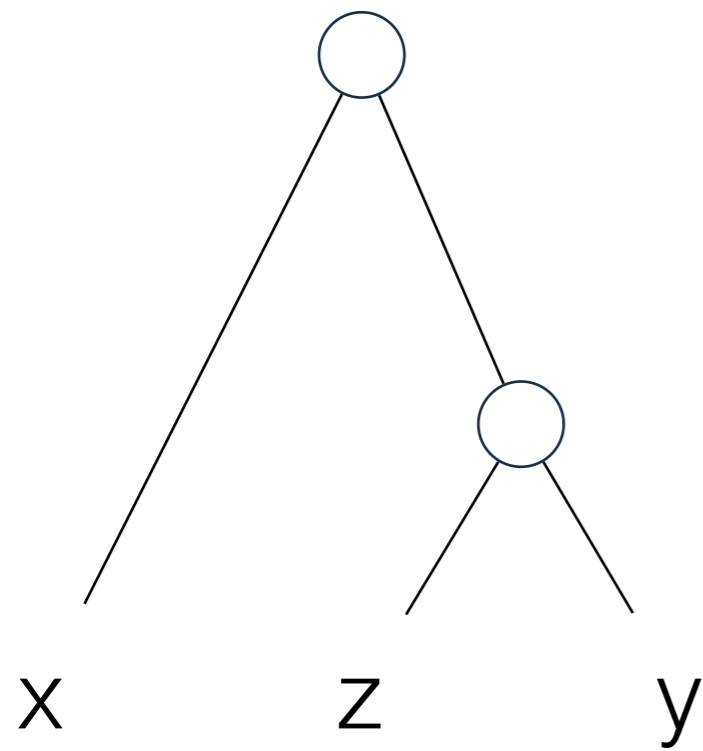
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**vtree**

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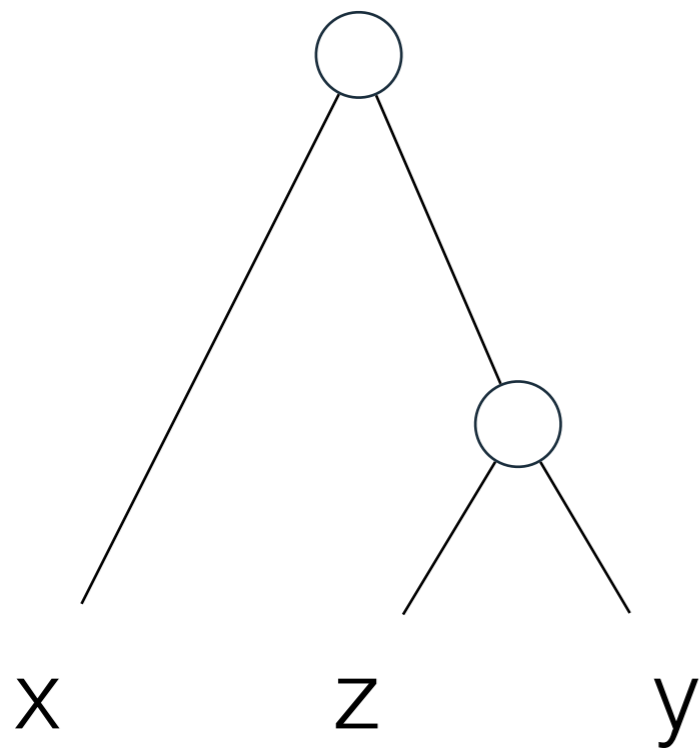
**vtree**



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**vtree**

**branch decomposition**



$C_1$

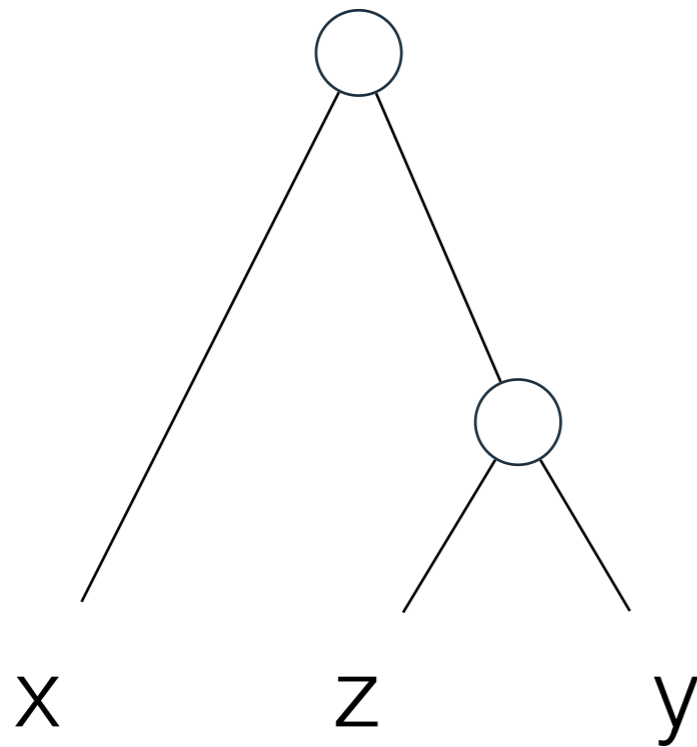
$C_2$

$C_3$

$$(x \vee \neg y \vee z) \wedge (\neg x \vee \neg z) \wedge (y \vee z)$$

**vtree**

**branch decomposition**



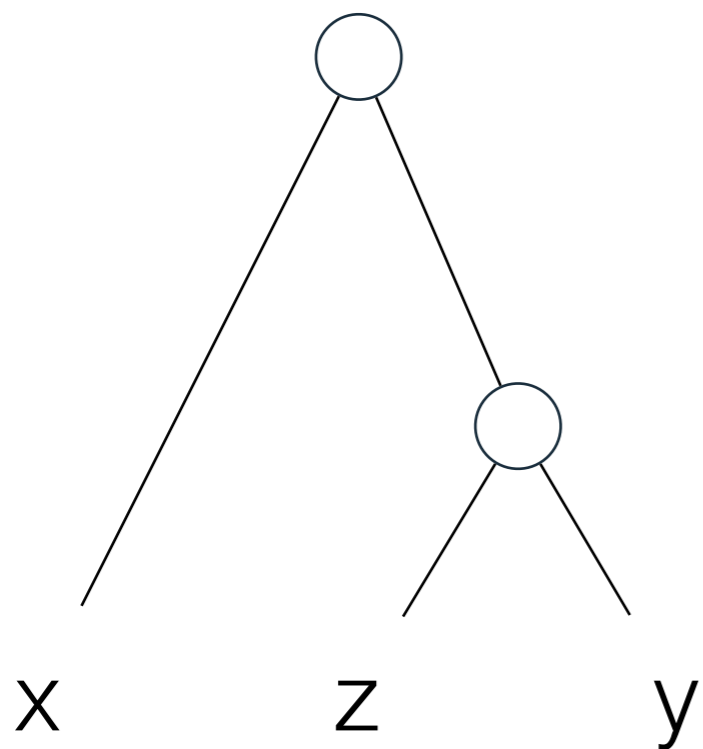
$C_1$

$C_2$

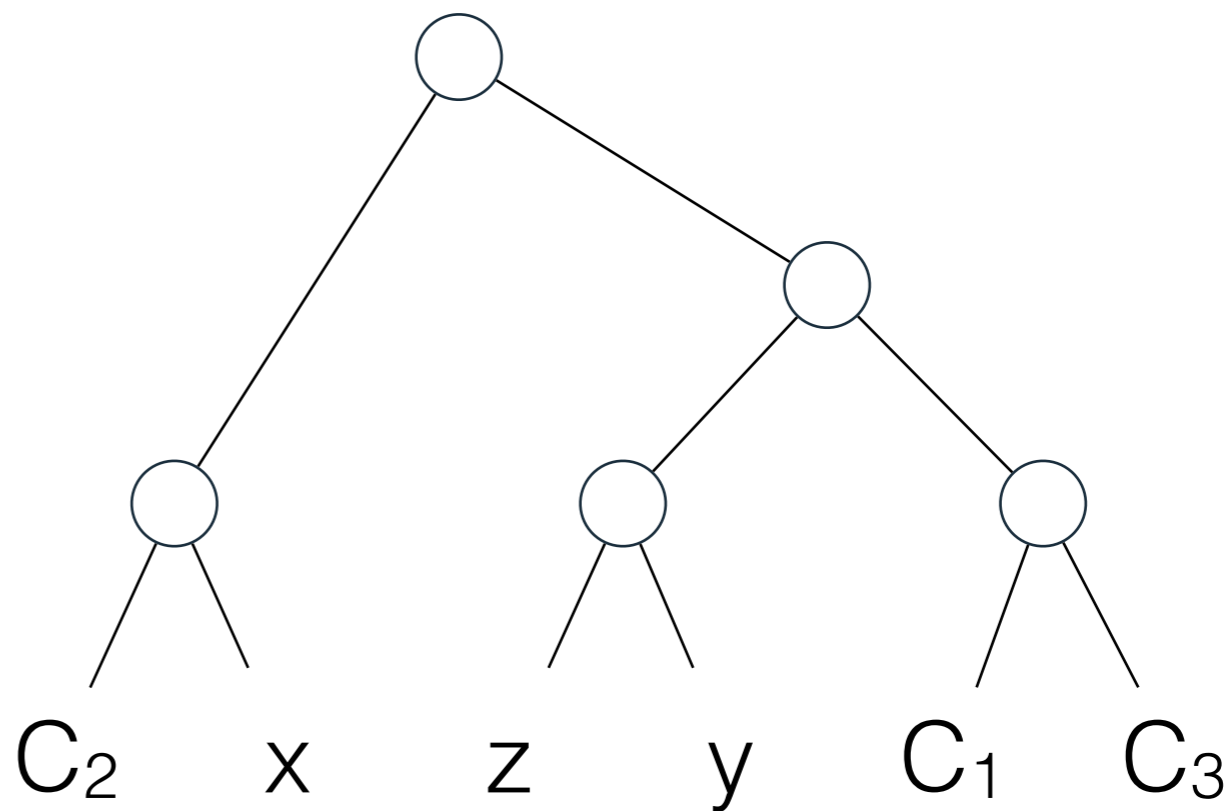
$C_3$

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**branch decomposition**



# Projections

The **projection** of  $F$  under assignment  $\tau$  is the set  $F(\tau)$  of clauses of  $F$  satisfied by  $\tau$ .

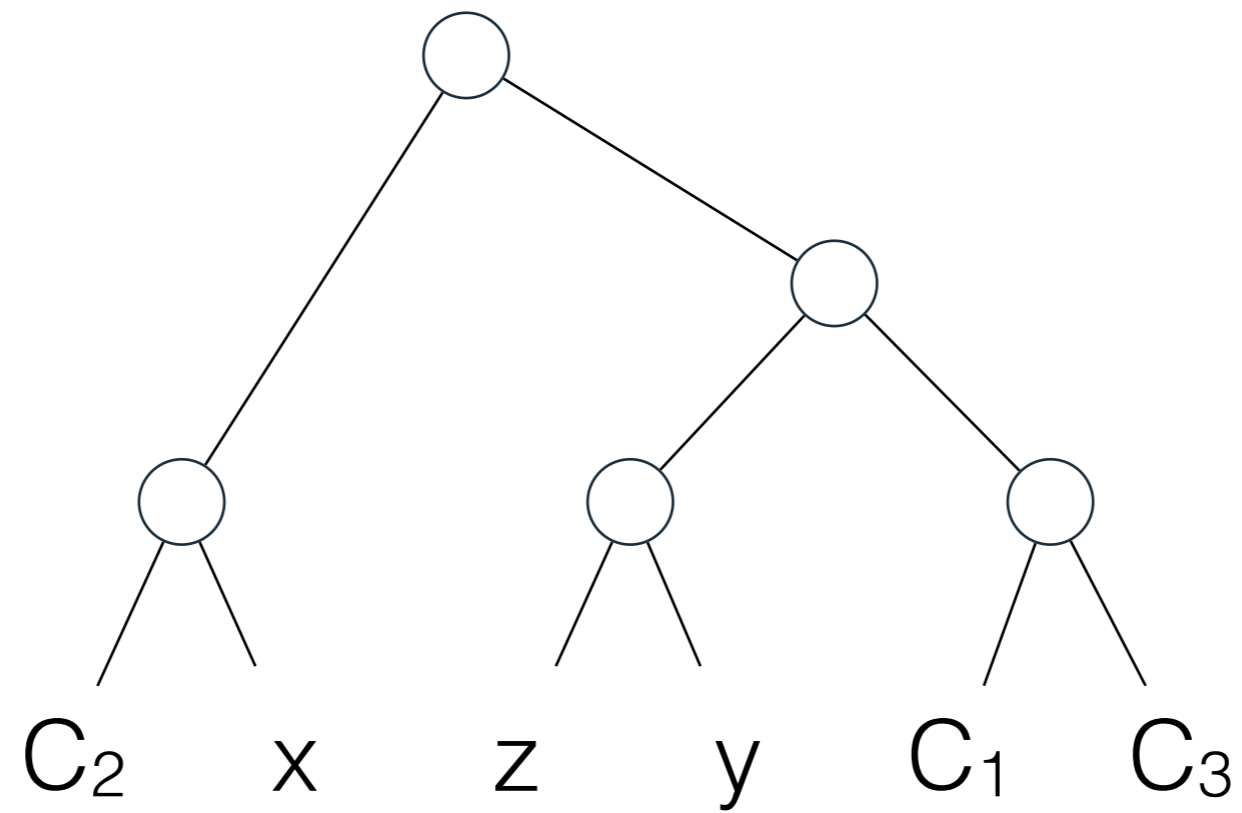


# Projections

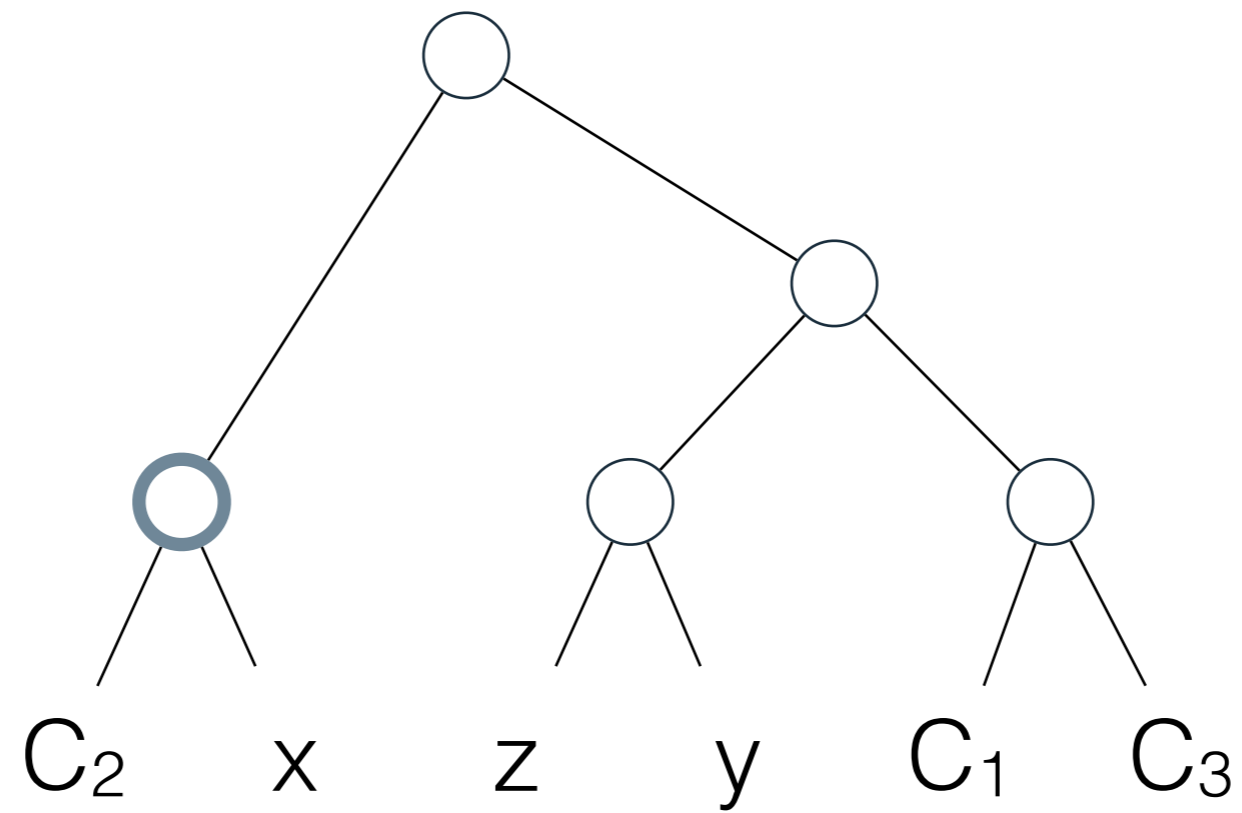
The **projection** of  $F$  under assignment  $\tau$  is the set  $F(\tau)$  of clauses of  $F$  satisfied by  $\tau$ .

**proj( $F, X$ )** the set of projections of  $F$  under assignments to  $X$ .

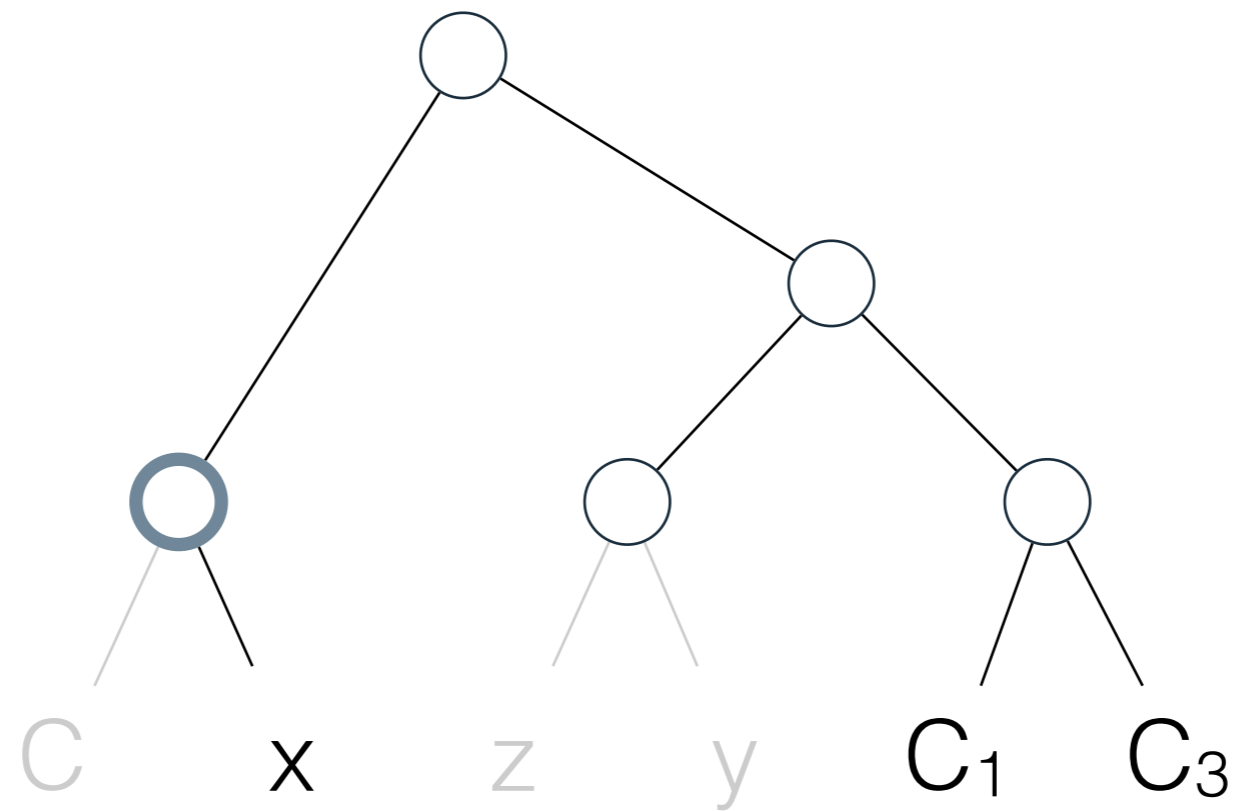
# PS-width



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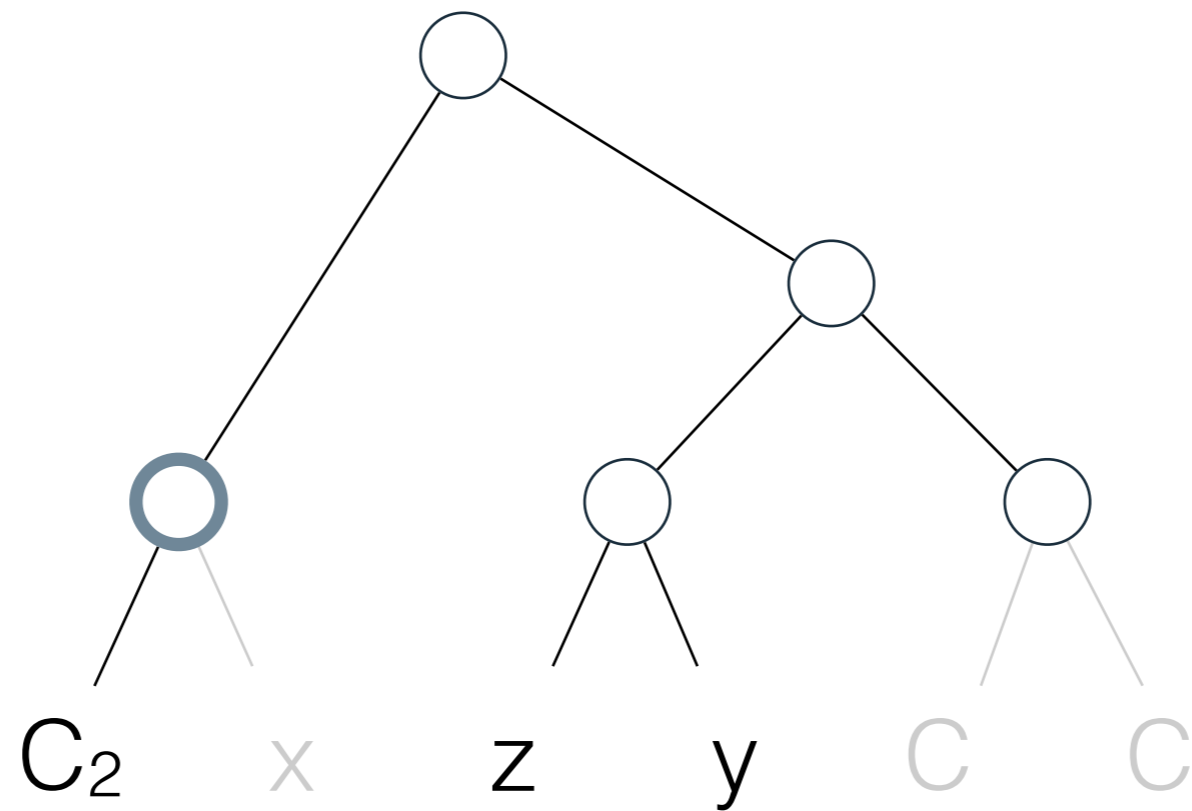


# PS-width



**proj({C<sub>1</sub>, C<sub>3</sub>}, {x})**

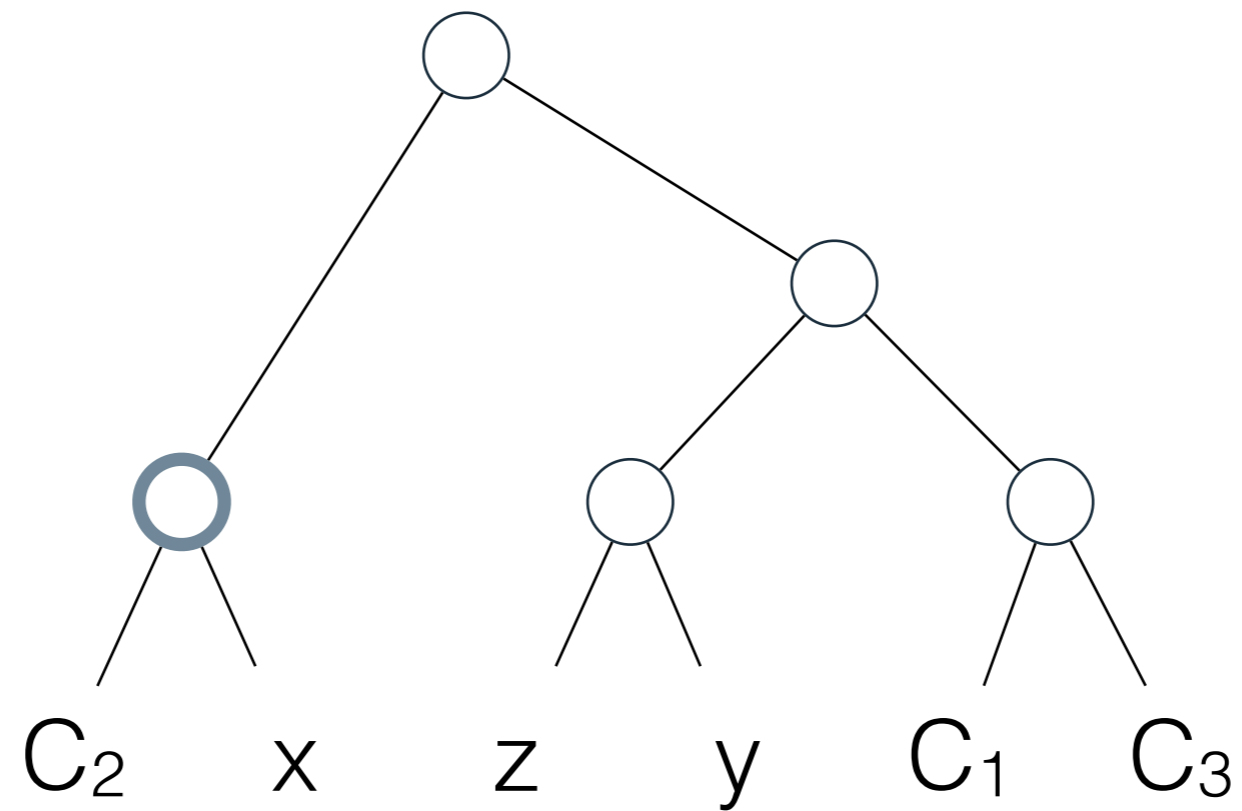
# PS-width



$\text{proj}(\{C_1, C_3\}, \{x\})$

**$\text{proj}(\{C_2\}, \{z, y\})$**

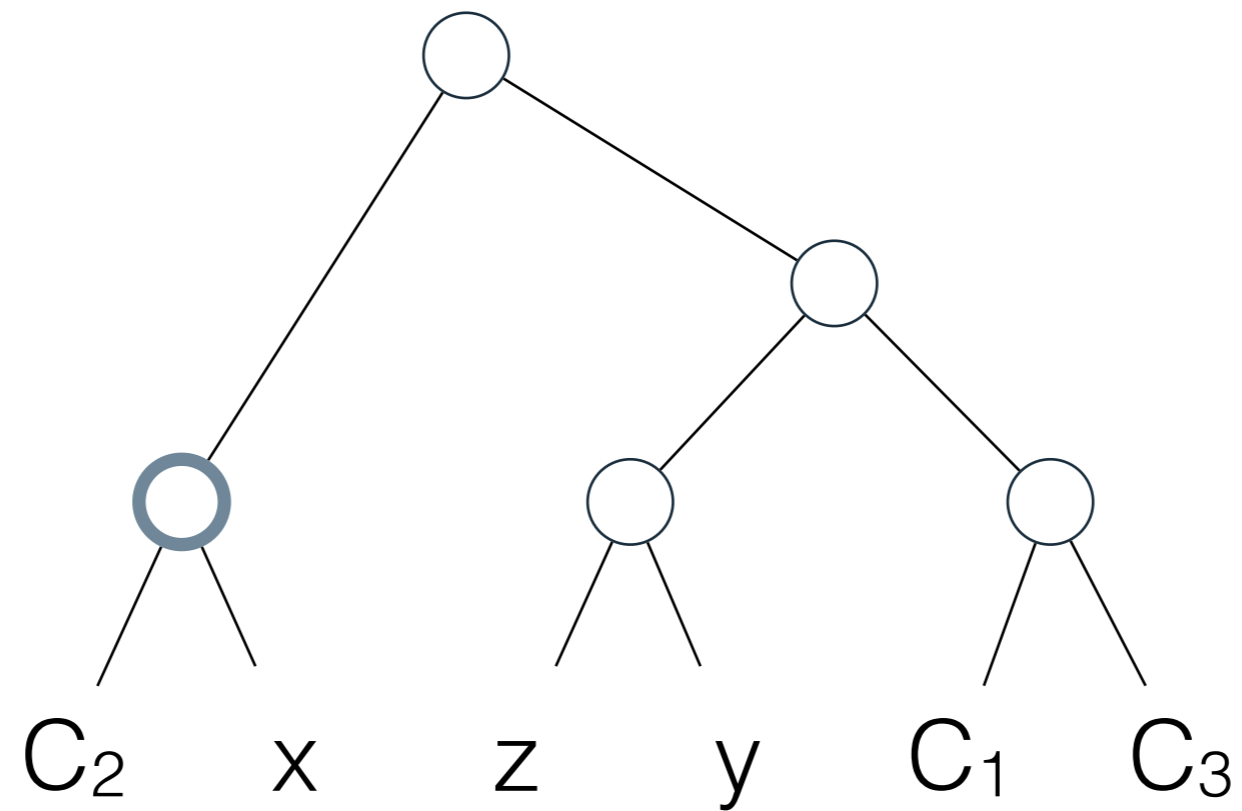
# PS-width



$$|\text{proj}(\{C_1, C_3\}, \{x\})|$$

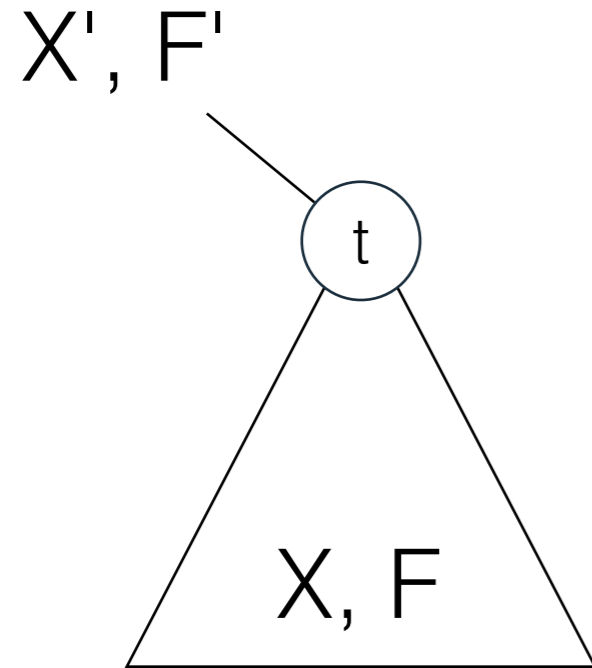
$$|\text{proj}(\{C_2\}, \{z, y\})|$$

# PS-width



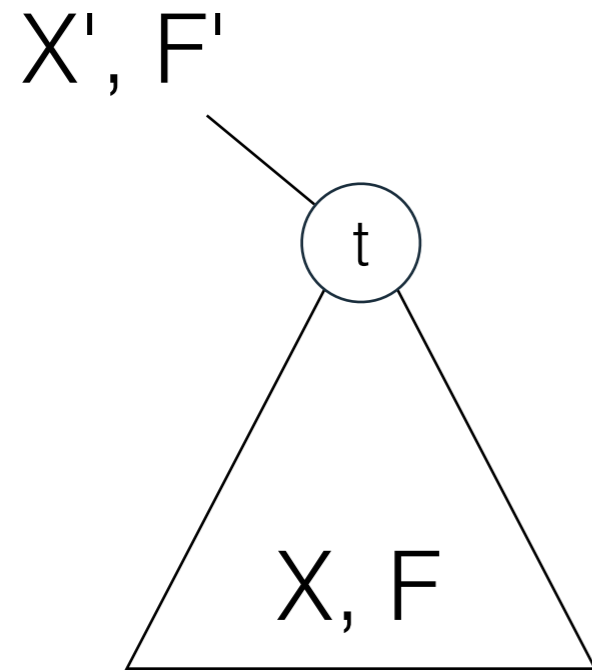
$$\max( |\text{proj}(\{C_1, C_3\}, \{x\})| , |\text{proj}(\{C_2\}, \{z, y\})| )$$

# Shapes



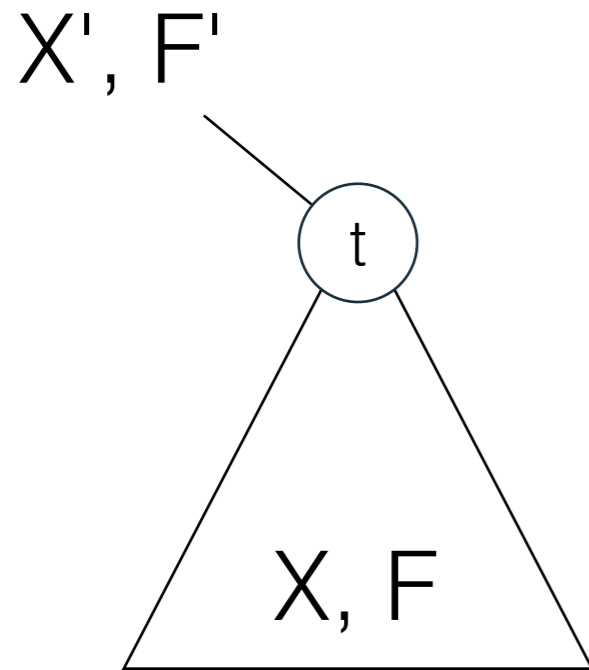


# Shapes



A **shape** for  $t$  is a pair  $(S, S')$  with  $S \in \text{proj}(F', X)$  and  $S' \in \text{proj}(F, X')$ .

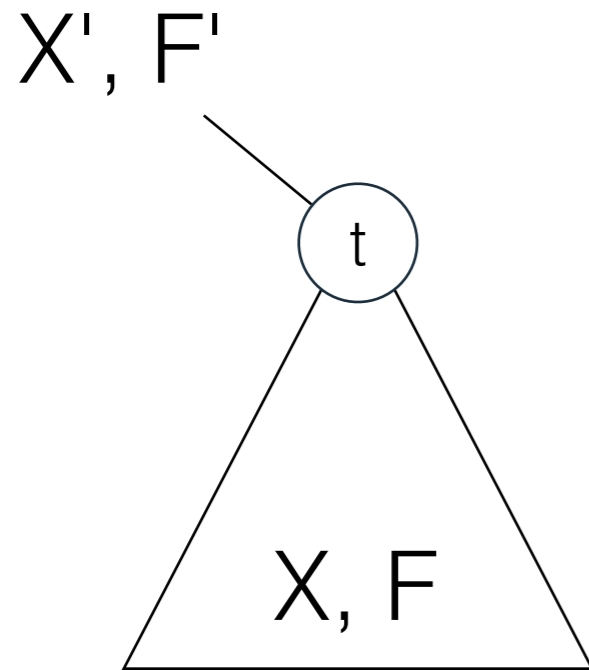
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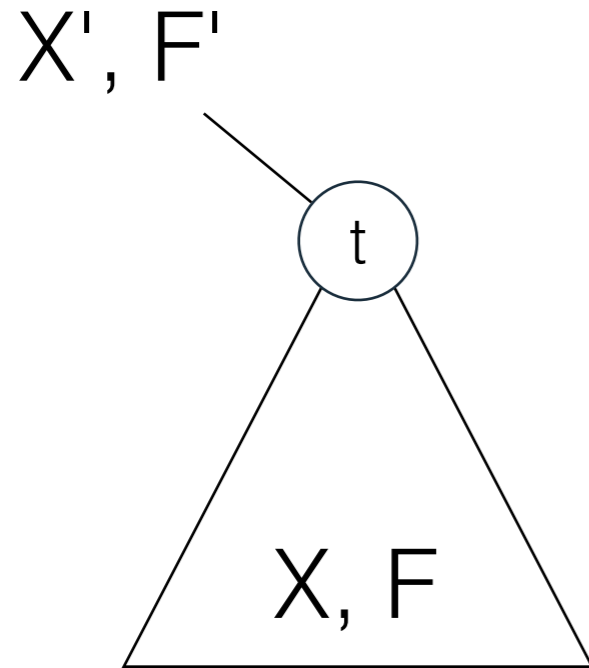


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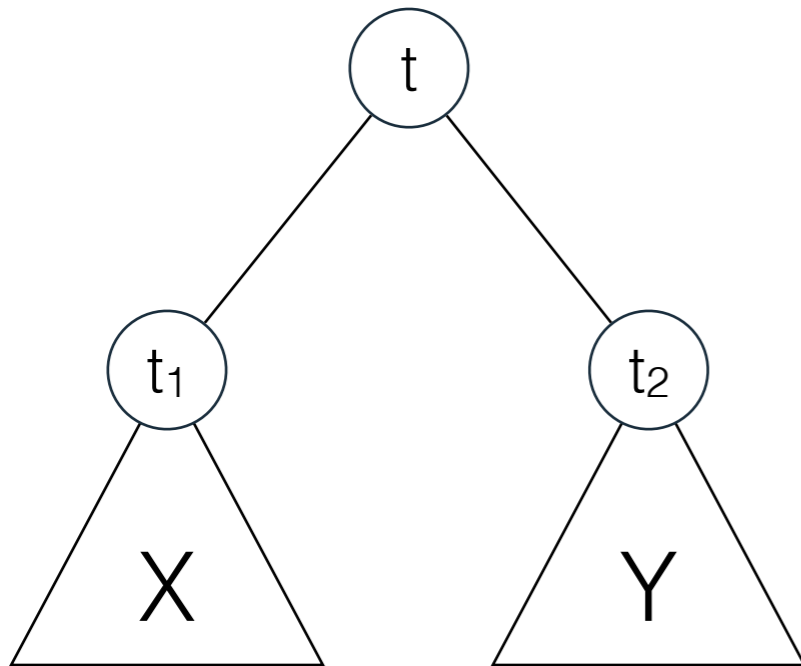


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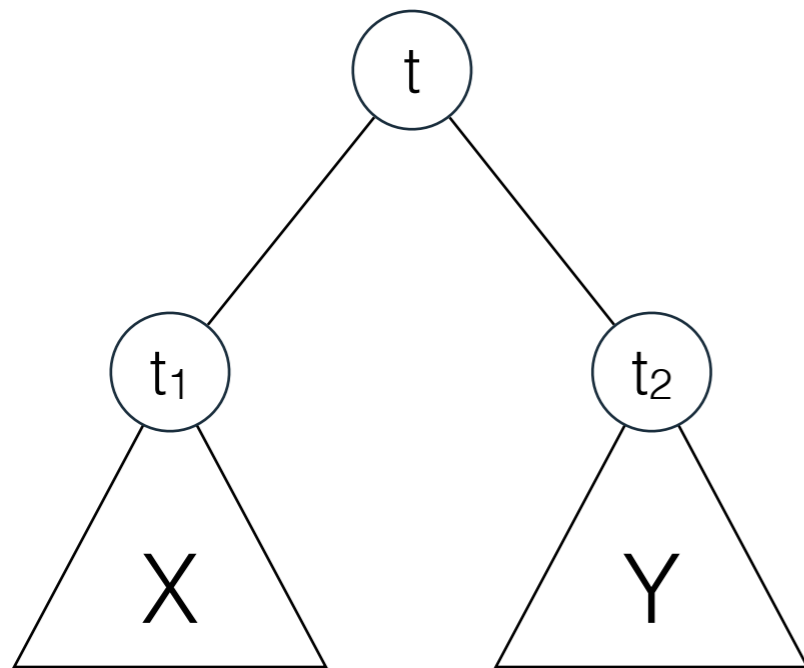
An assignment  $\tau: X \rightarrow \{0, 1\}$  **has shape**  $(S, S')$  if

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2.  $F(\tau) \cup S' = F$

# Decomposing Shapes

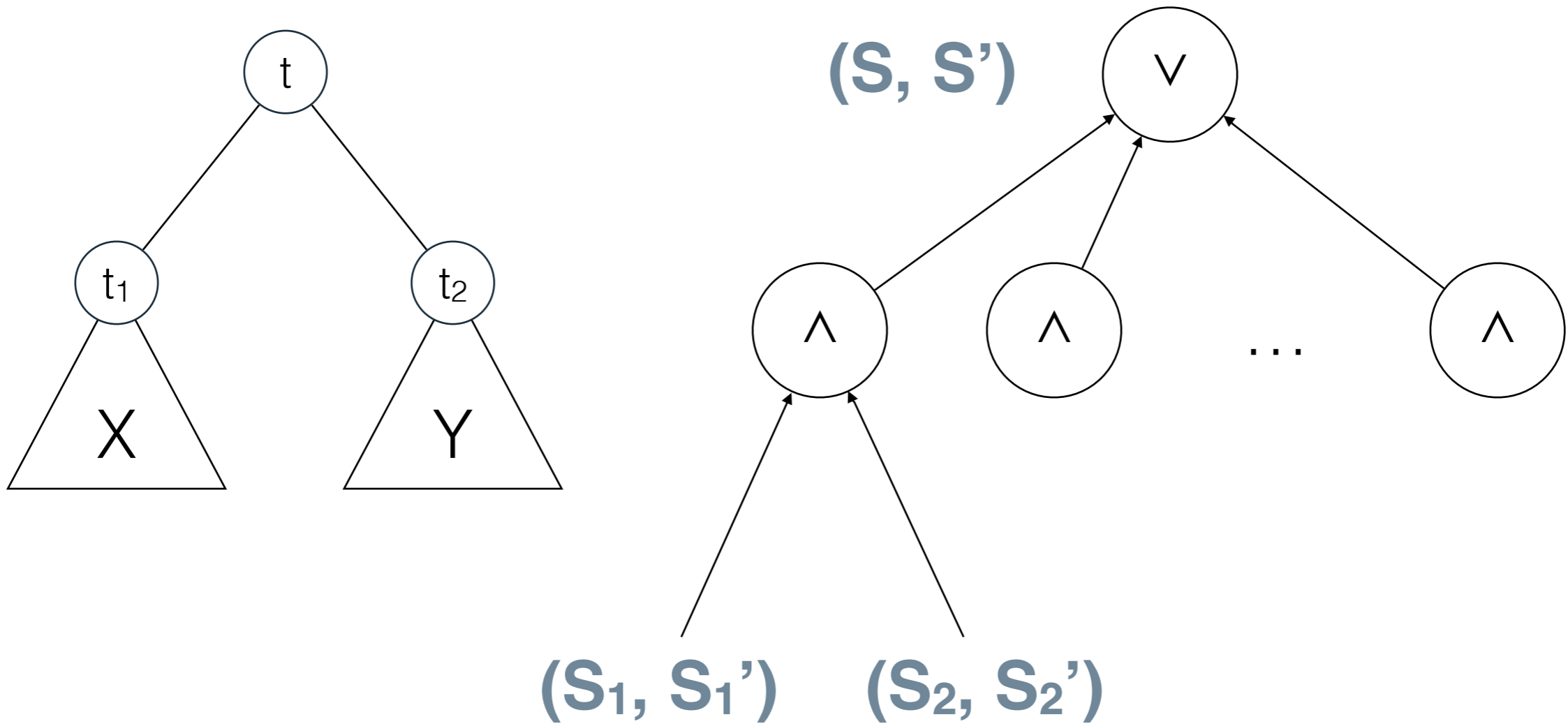


# Decomposing Shapes

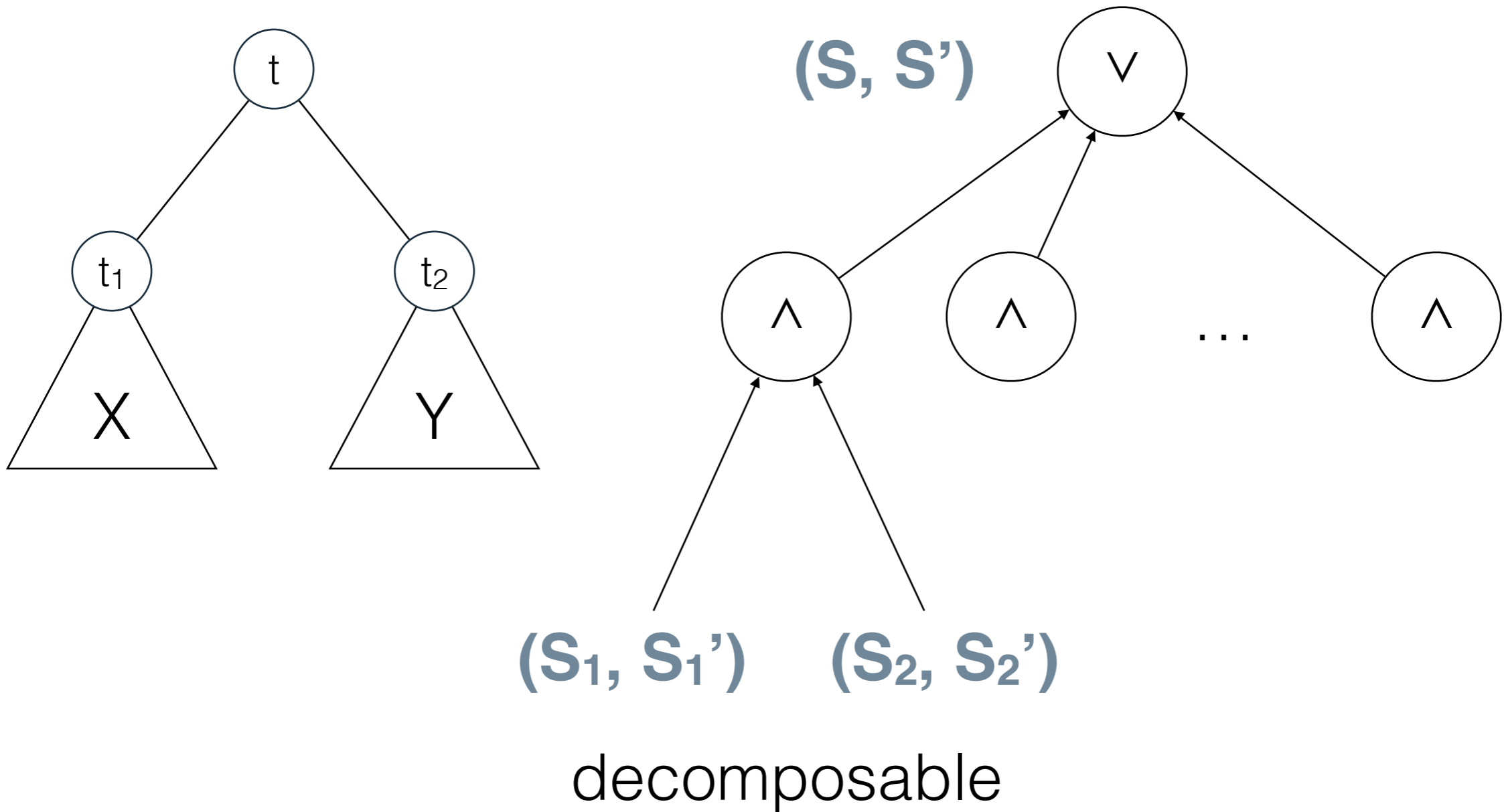


**(S, S')**

# Decomposing Shapes

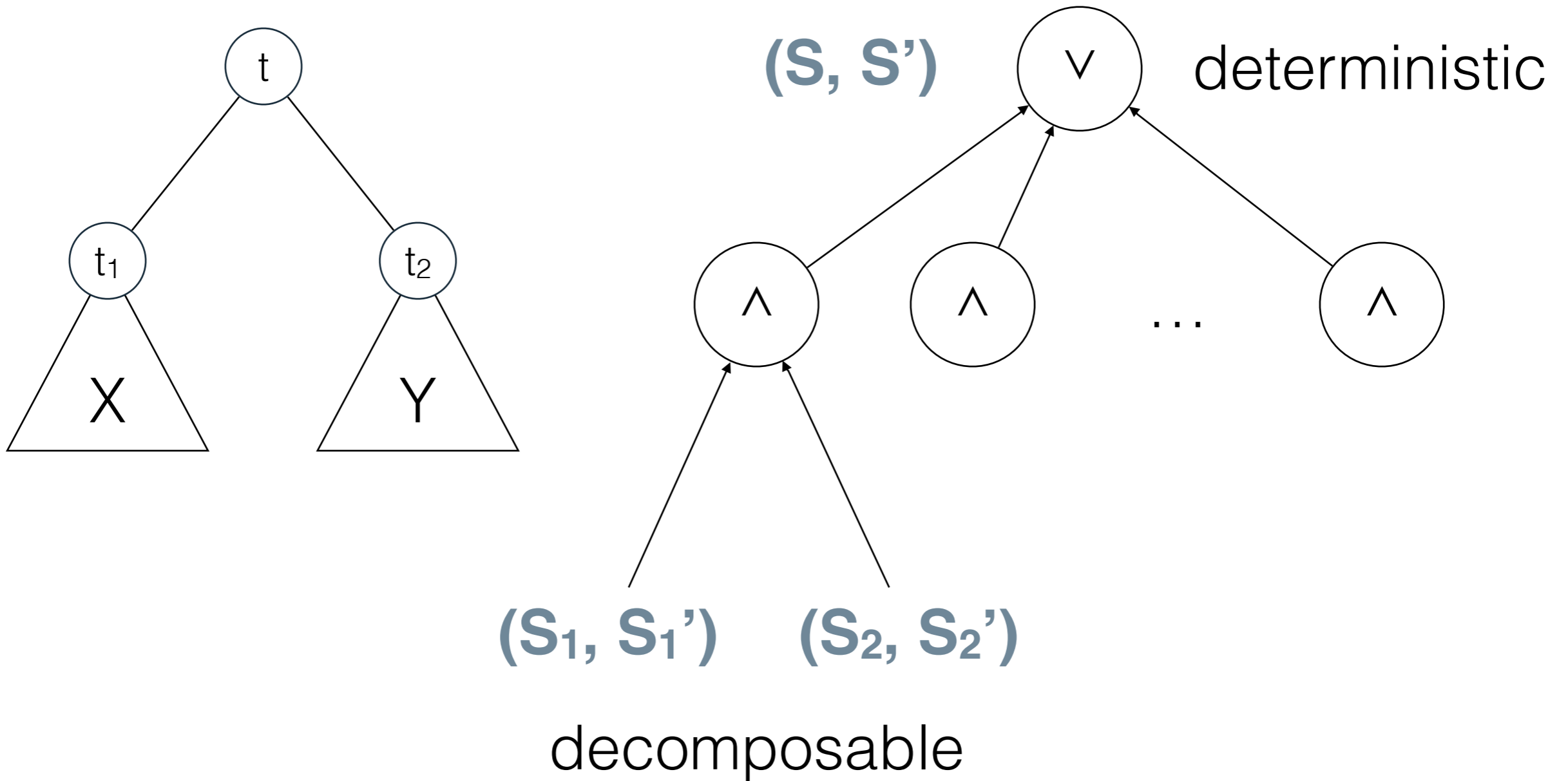


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Can decompositions of small PS-width be computed efficiently?