



Logical foundations of databases

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CNRS

LaBRI



Recap

- **Conjunctive Queries** (correspondence with SQL and Relational Algebra)
- **Homomorphisms and canonical structure**
- **Evaluation of CQ** (NP-completeness)
- **Containment, Equivalence, Minimisation of CQ** (NP-completeness)
- **Extension to functional dependencies** (chased canonical structure)
- **Acyclic Conjunctive Queries**

Acyclic CQ's : Definition

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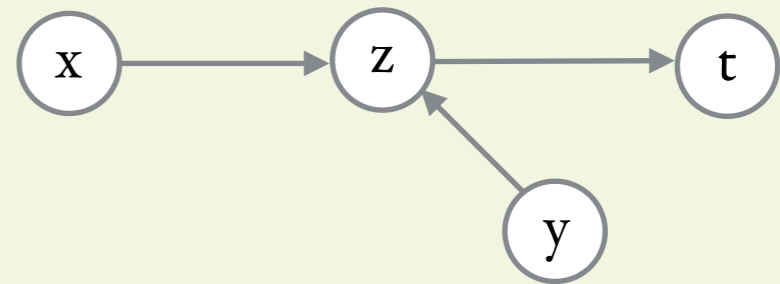
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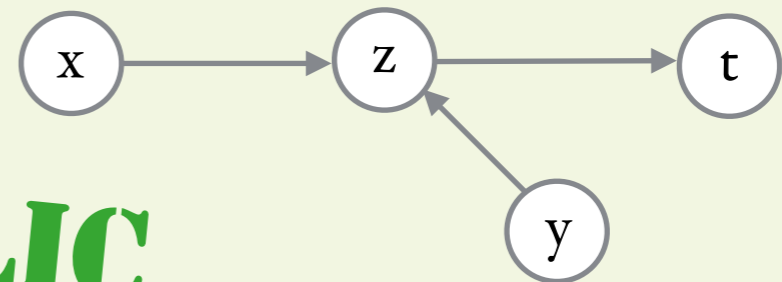


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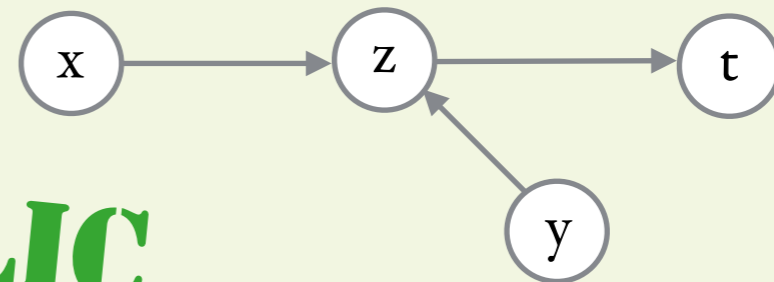
ACYCLIC

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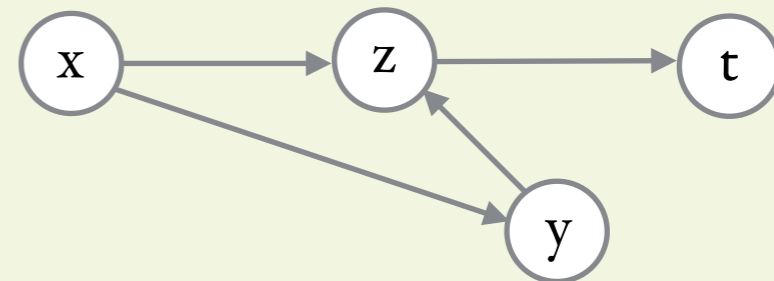
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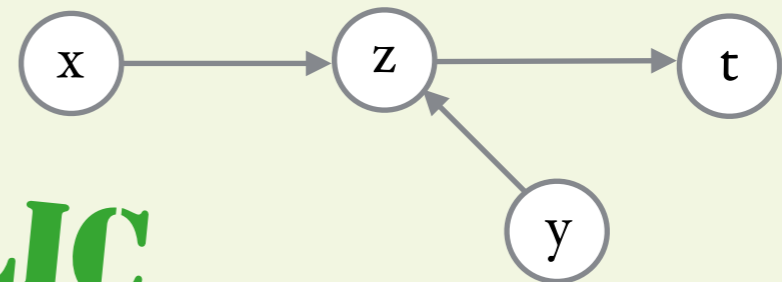


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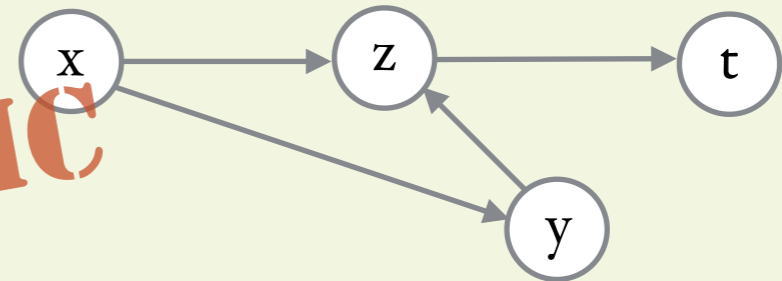
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NON ACYCLIC

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Acyclic CQ's

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On general structures: a CQ ϕ is **acyclic** if it has a join tree

$$\phi(\bar{y}) = \exists \bar{z} . R_1(\bar{z}_1) \wedge \dots \wedge R_m(\bar{z}_m)$$

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A **join tree** is a tree T st:

- nodes are the atoms $R_i(\bar{z}_i)$
- for every variable x of ϕ the set of $R_i(\bar{z}_i)$'s with $x \in \bar{z}_i$ forms a subtree of T

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Alternatively, if its canonical hyper-graph is α -acyclic.

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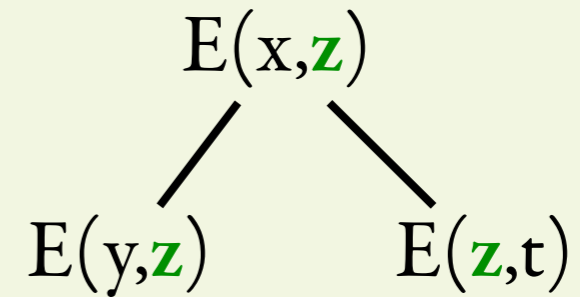
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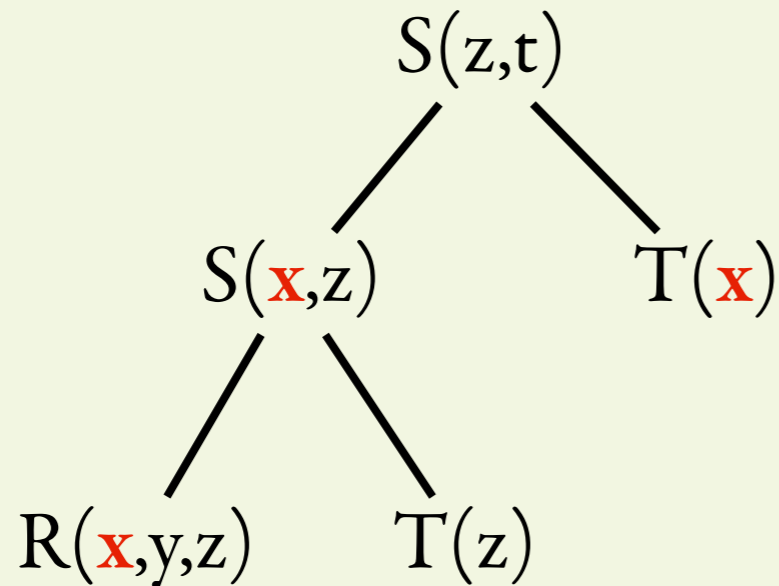
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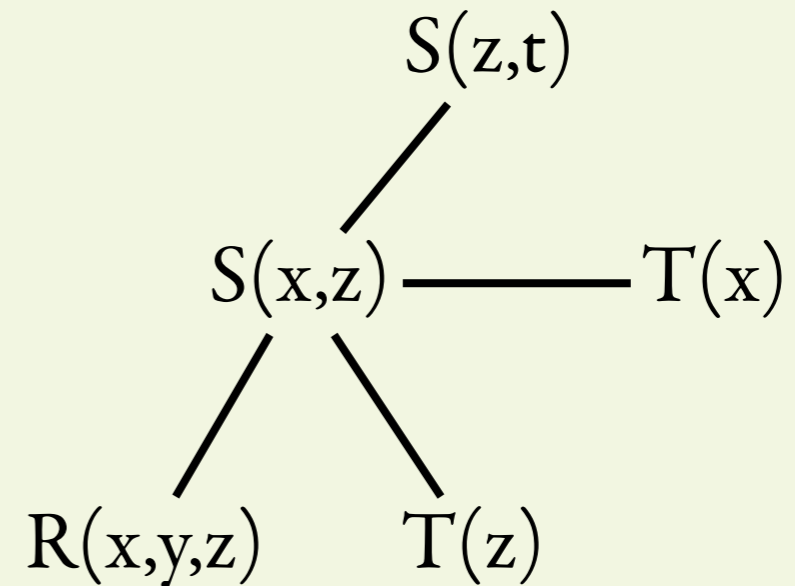


join tree

$$\phi = \exists x,y,z,t . R(x,y,z) \wedge S(z,t) \wedge S(x,z) \wedge T(z) \wedge T(x)$$



not a join tree



a join tree

Acyclic CQ's

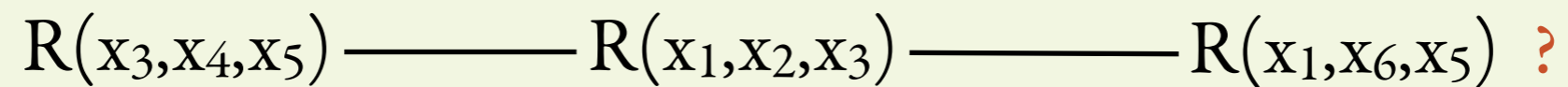
$$\phi_1 = R(x_1, x_2, x_3) \wedge R(x_1, x_6, x_5) \wedge R(x_3, x_4, x_5)$$

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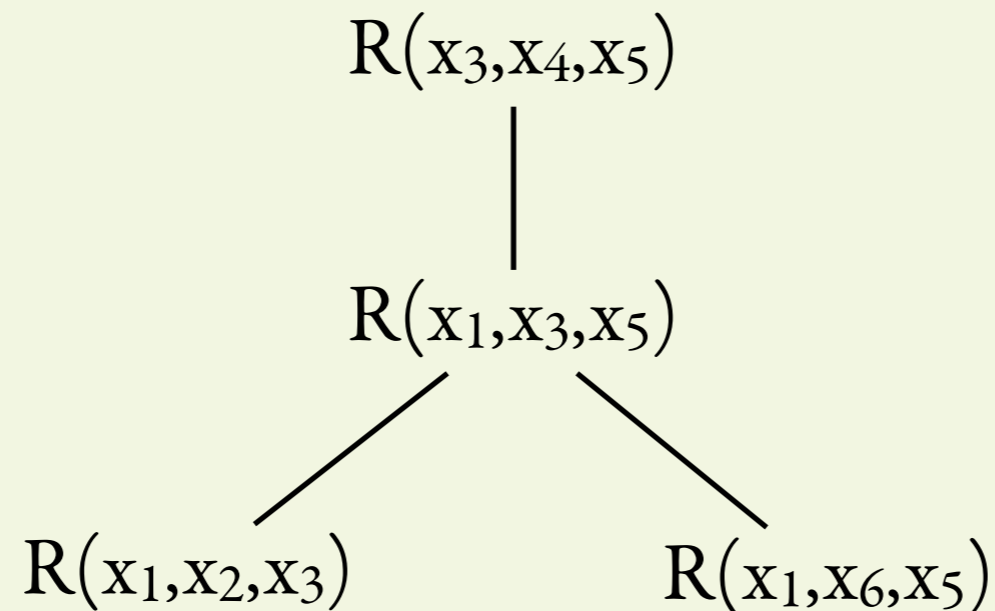
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Acyclic CQ's



The evaluation problem for acyclic CQ sentences is in $O(|\phi| \cdot |D|)$

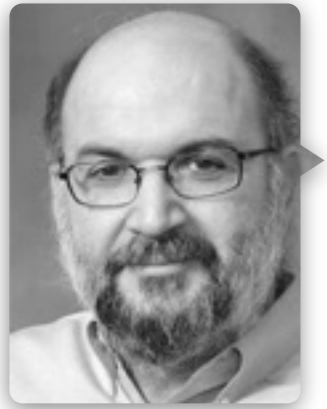
[Yannakakis]

The **semi-join**

$$R \bowtie_{\{i_1=j_1, \dots, i_n=j_n\}} S = \{ (x_1, \dots, x_n) \in R \mid \text{there is } (y_1, \dots, y_m) \in S \\ \text{where } x_{i_k} = y_{j_k} \text{ for all } k \}$$

Note: $R \bowtie_{\{i_1=j_1, \dots, i_n=j_n\}} S \subseteq R$

Acyclic CQ's

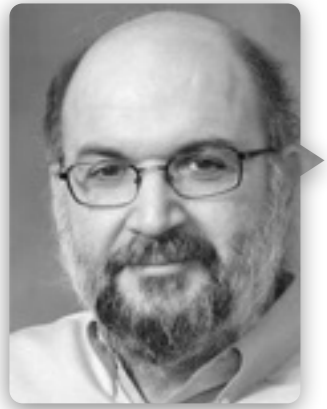


The evaluation problem for acyclic CQ sentences is in $O(|\phi| \cdot |D|)$

[Yannakakis]

1. Compute the join tree T for ϕ
2. Populate the nodes of T with corresponding relations of D
3. For every leaf $S(x_1, \dots, x_n)$ with parent $R(y_1, \dots, y_m)$ perform
$$R \bowtie_{\{i=j \mid x_i = y_j\}} S$$
and delete the leaf $S(x_1, \dots, x_n)$.
4. Repeat until we are left with one node. If it contains a non-empty relation, then D satisfies ϕ , otherwise it does not.

Acyclic CQ's



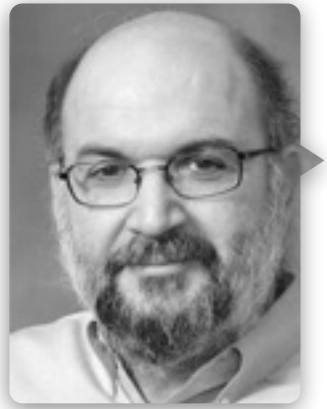
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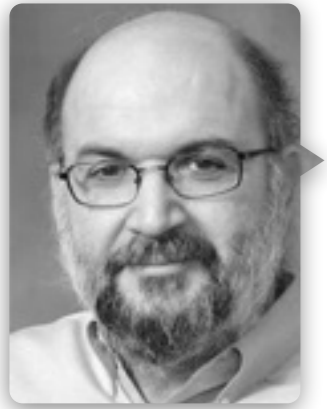
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remove all the tuples from the parent that do not match a tuple from the child

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(combined c.)

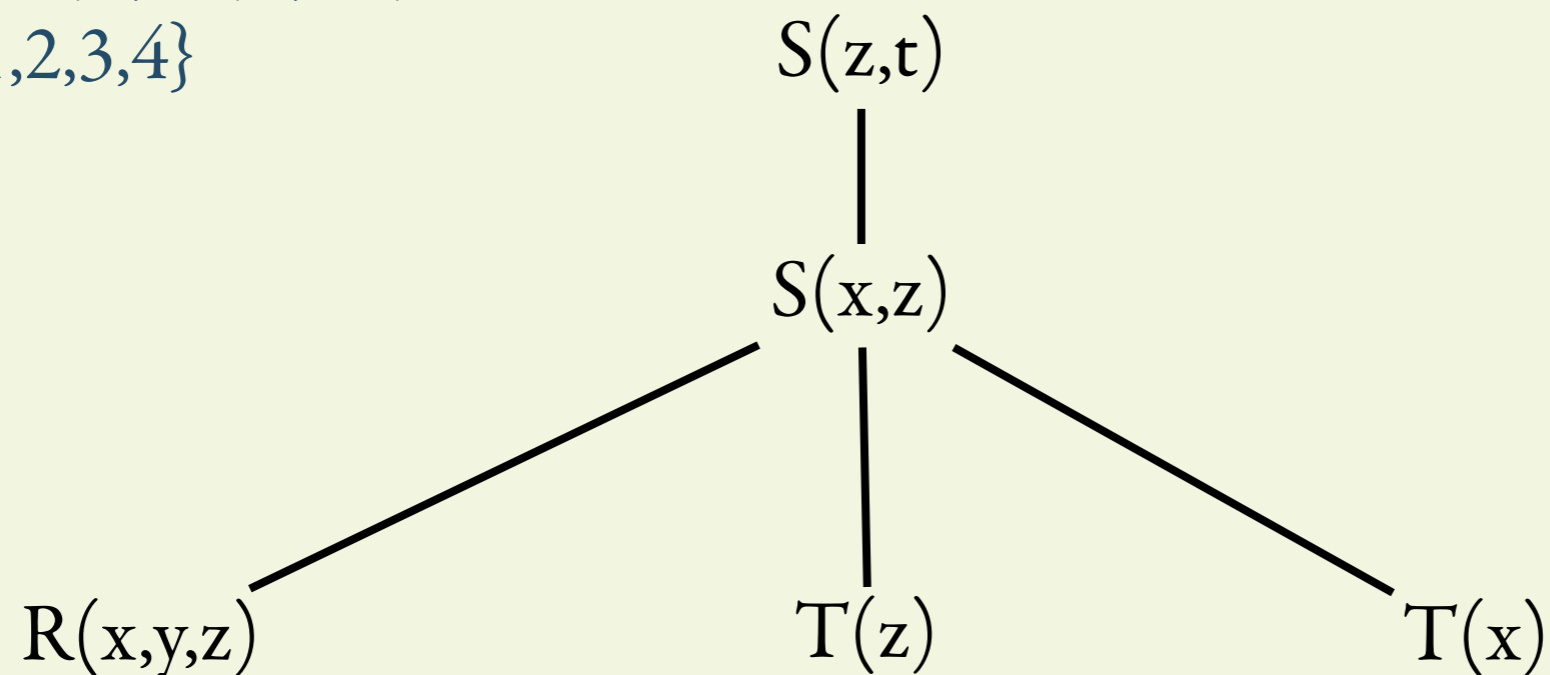
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$$\phi = \exists x,y,z,t . R(x,y,z) \wedge S(z,t) \wedge S(x,z) \wedge T(z) \wedge T(x)$$

$$R = \{(1,4,4), (4,1,4)\}$$

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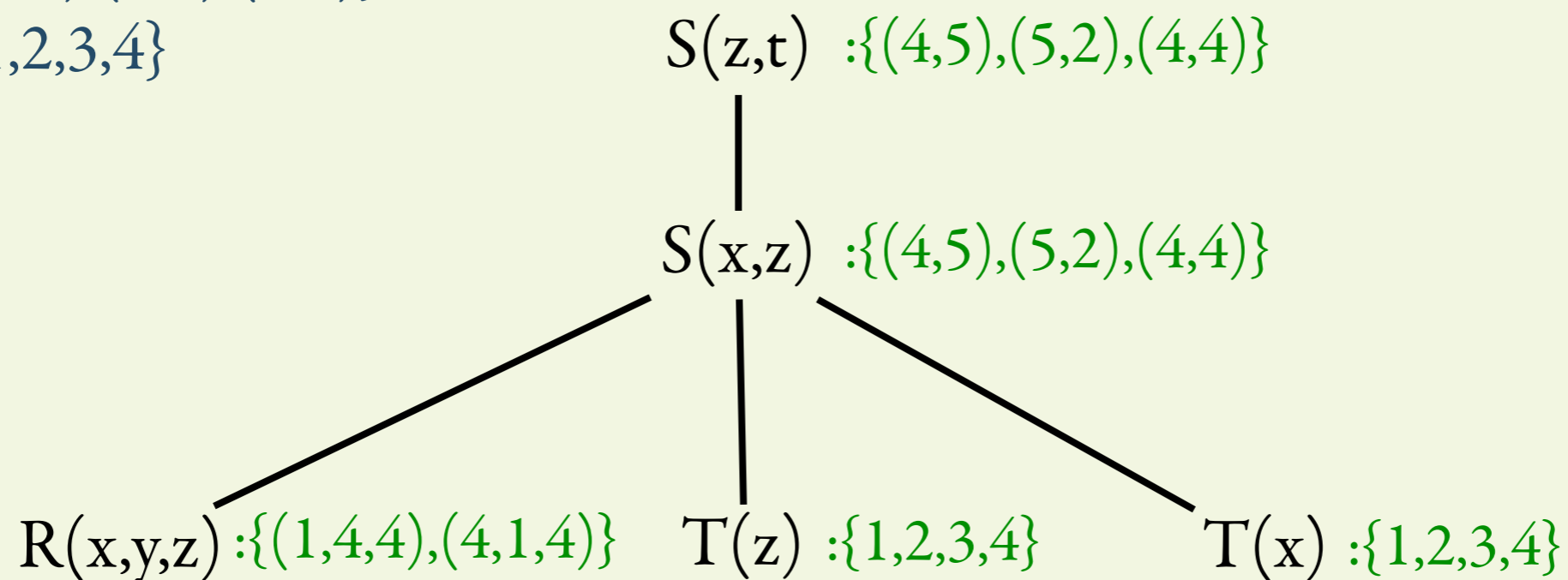
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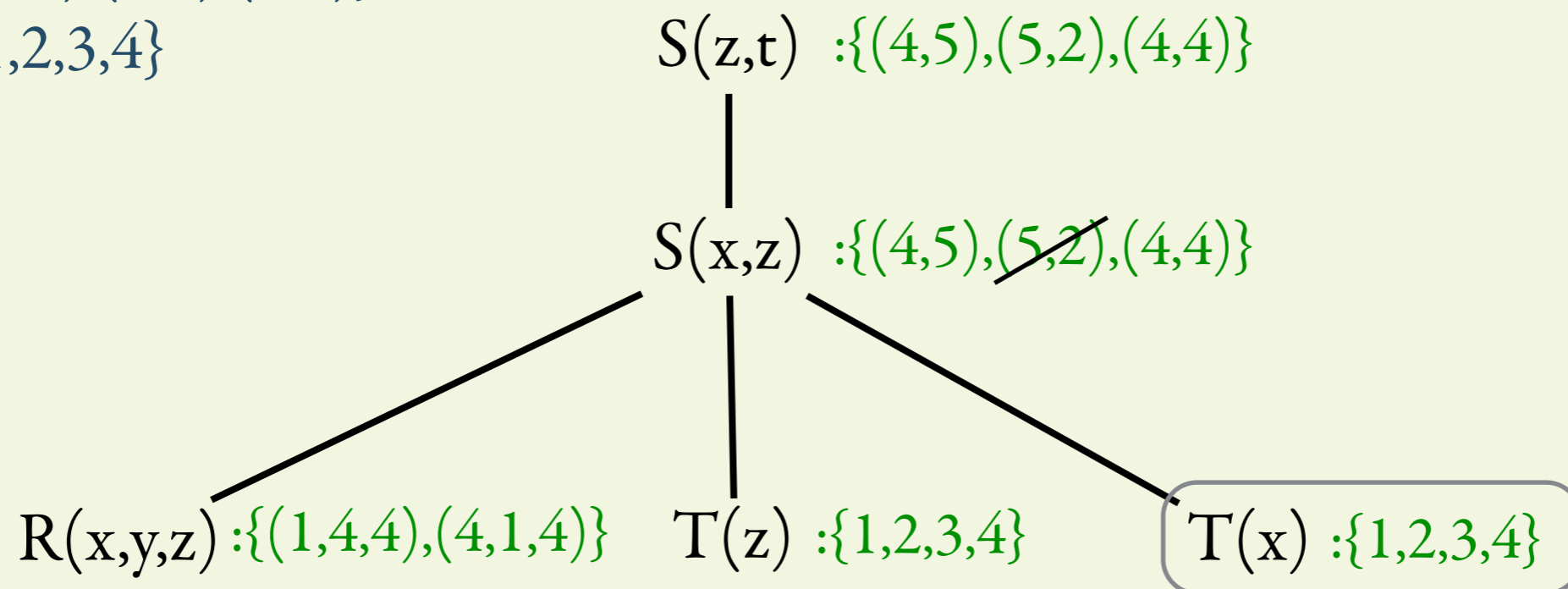
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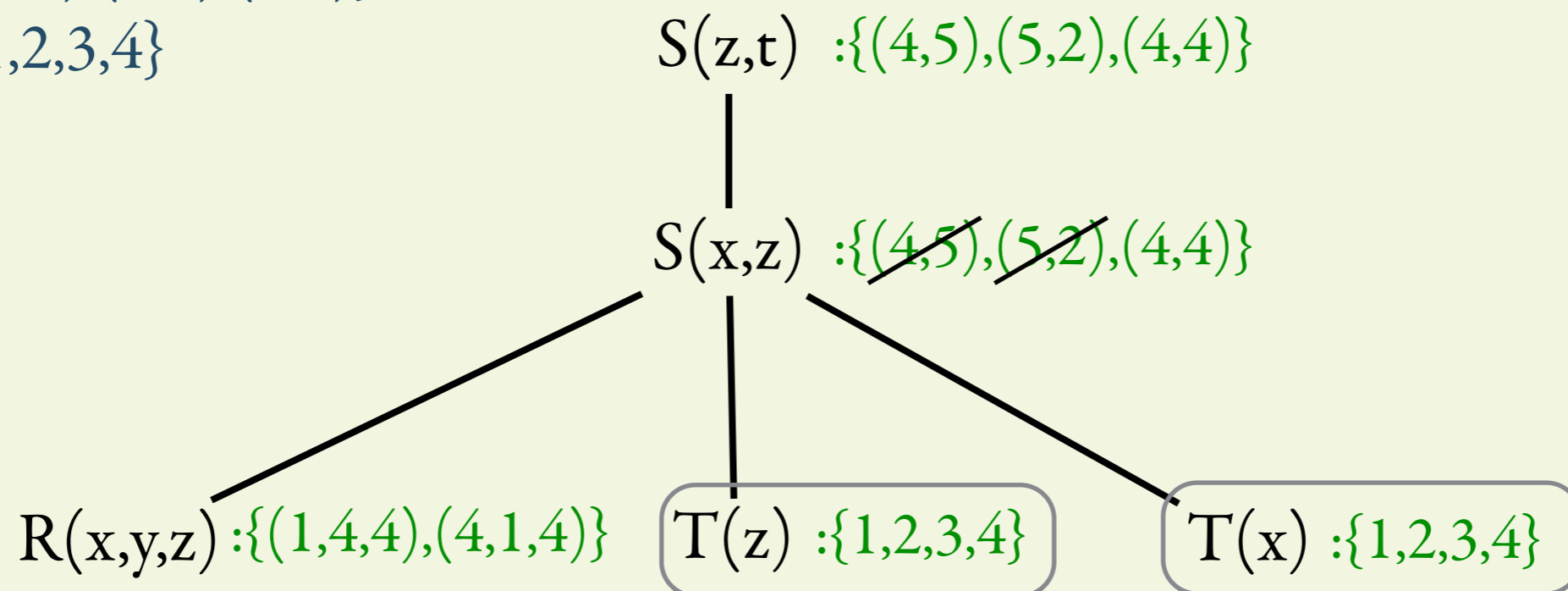
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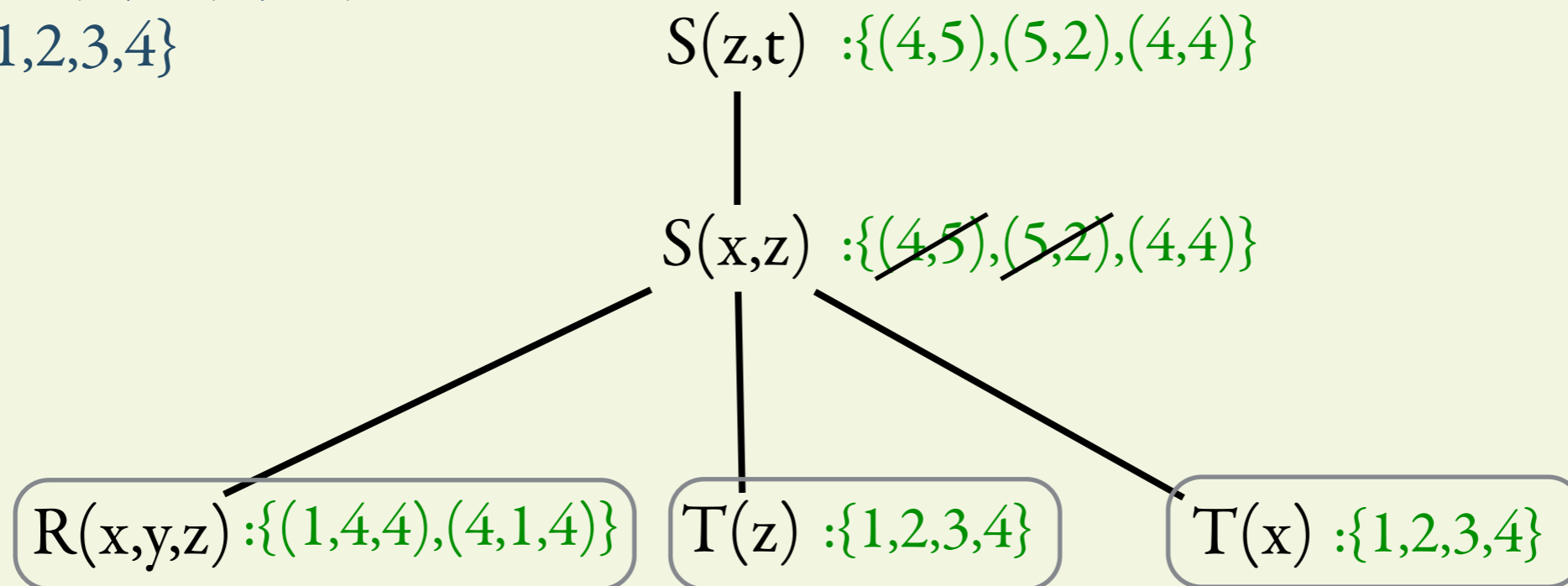
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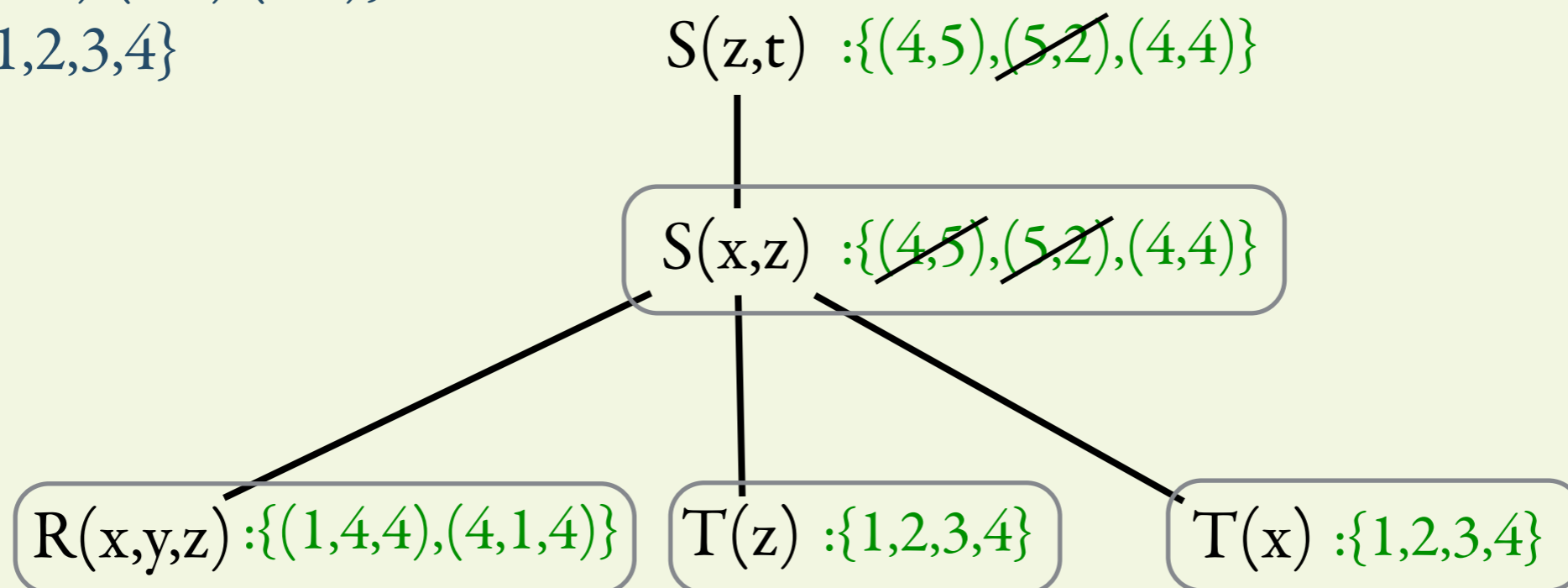
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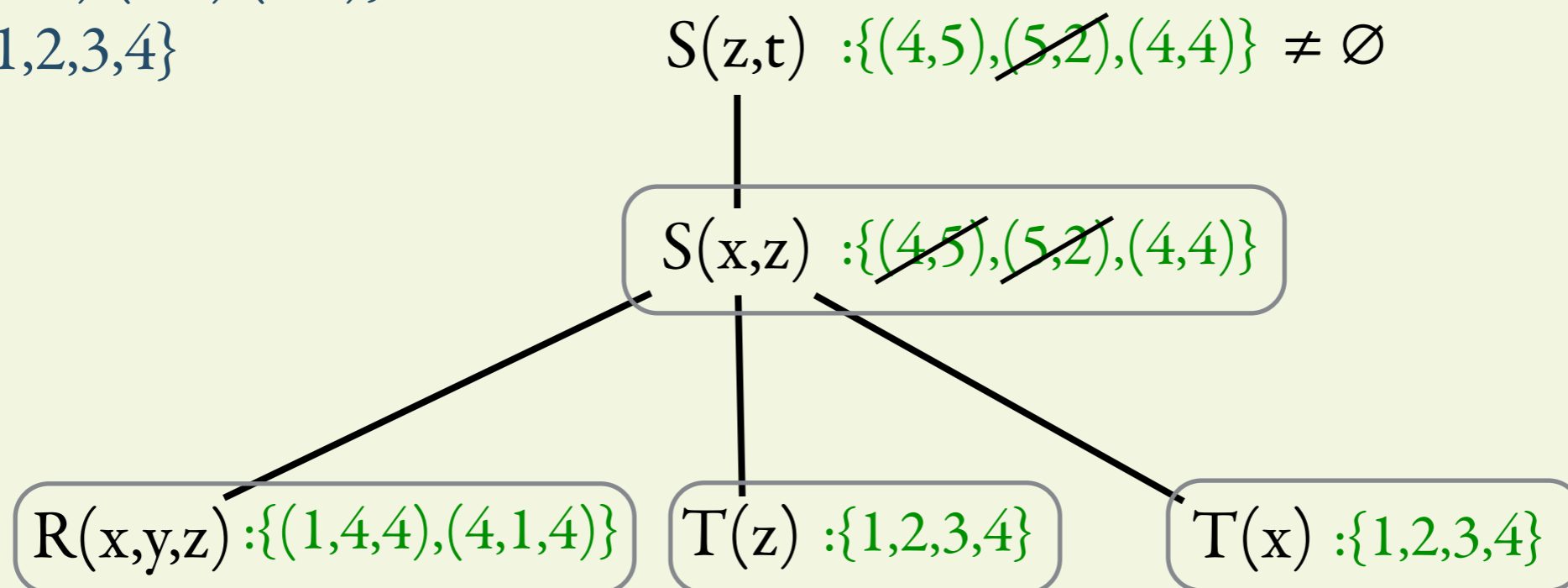
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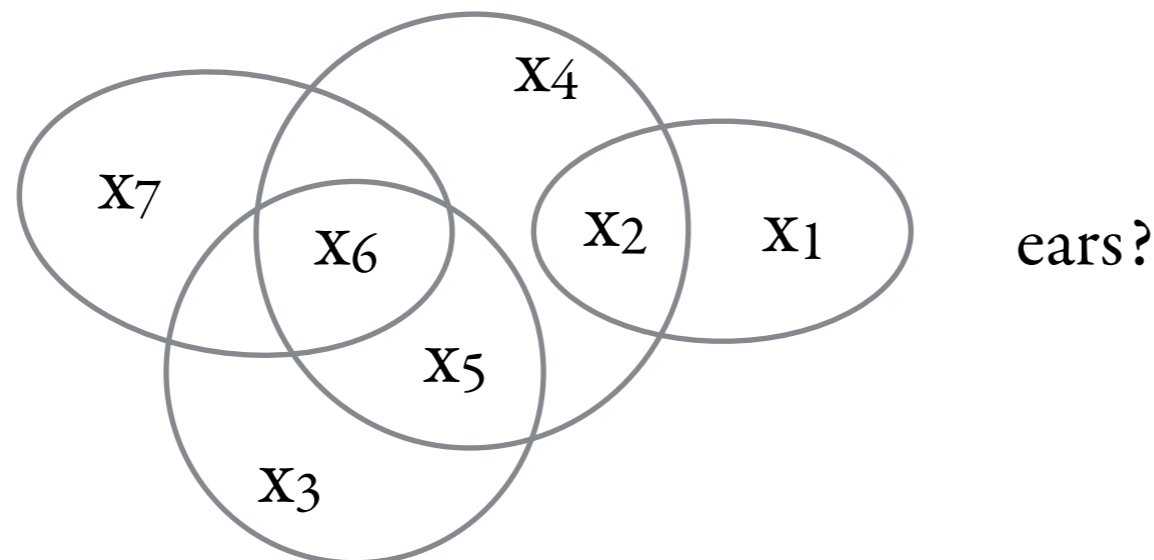


How to compute a join tree?

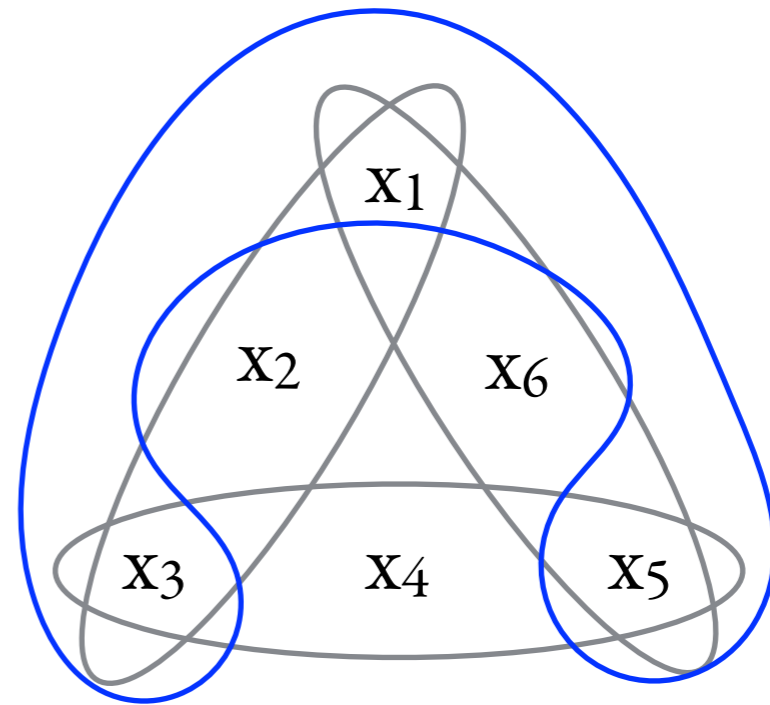
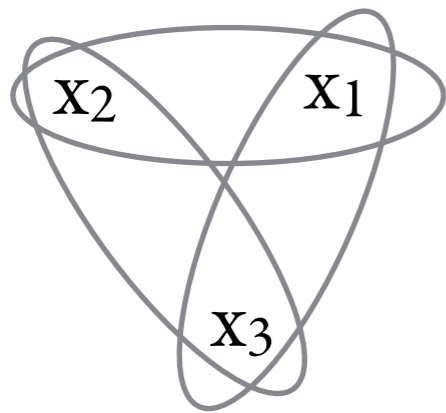
GYO reducts [Graham, Yu, Ozsoyoglu]

An **ear** of a hypergraph (V,E) is a hyperedge e in E such that one of the following conditions holds:

- (1) There is a **witness** e' in E , such that $e' \neq e$ and each vertex from e is either
 - (a) only in e or
 - (b) in e' ; or
- (2) e has no intersection with any other hyperedge.



Ears?



Ears!

Definition: The GYO **reduct** of a hyper-graph is the result of removing ears until no more ears are left.

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Theorem: TFAE

- The GYO **reduct** of a hyper graph **G** is empty
- A CQ ϕ having **G** as underlying canonical hyper-graph is acyclic
- The hyper graph **G** is α -acyclic

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We can test acyclicity by computing the GYO reduct!

Acyclic CQ's

How to compute a join tree?

GYO algorithm [Graham, Yu, Ozsoyoglu]

Given the query $\phi = R_1(X_1) \wedge \dots \wedge R_n(X_n)$

Consider its canonical structure G_ϕ

For $R_i(X_i)$ an ear with witness $R_j(Y_j)$

Put an edge between $R_i(X_i)$ and $R_j(X_j)$, and remove R_i from ϕ .

Repeat.

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E.g.

$R(x,y,z), S(x,y), T(x,x), R(x,x,y), T(y,y)$

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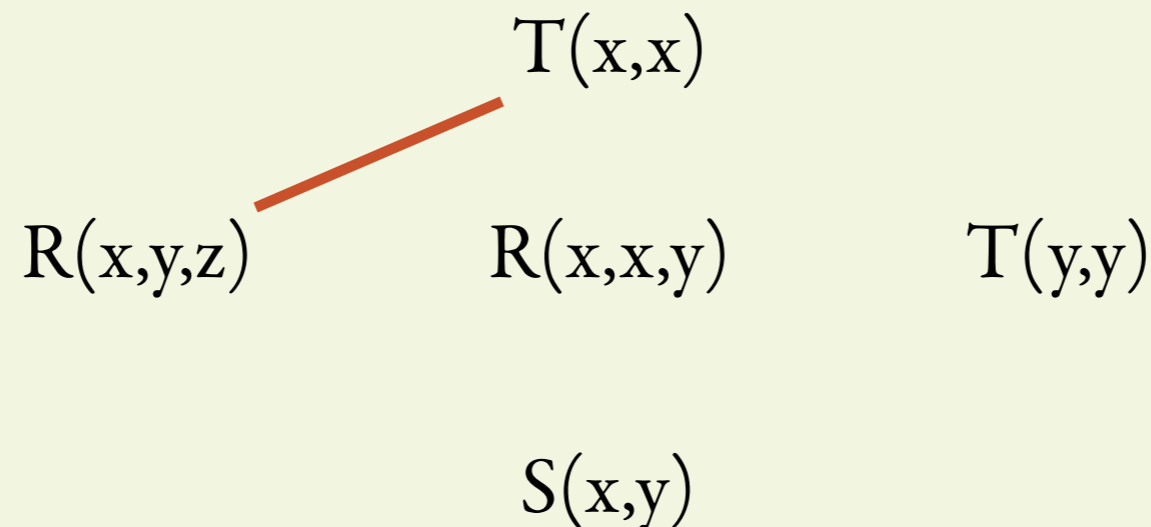
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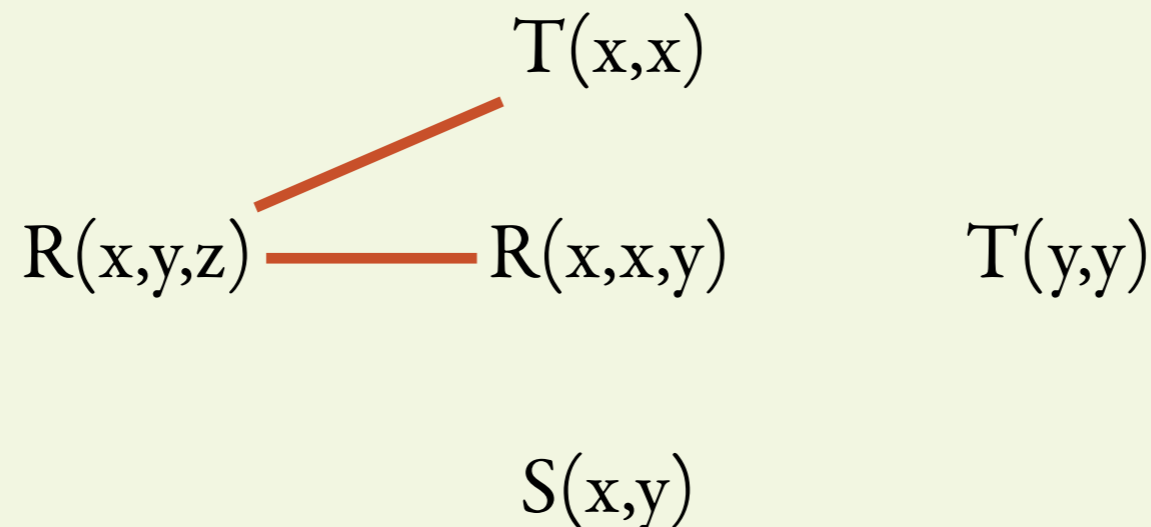
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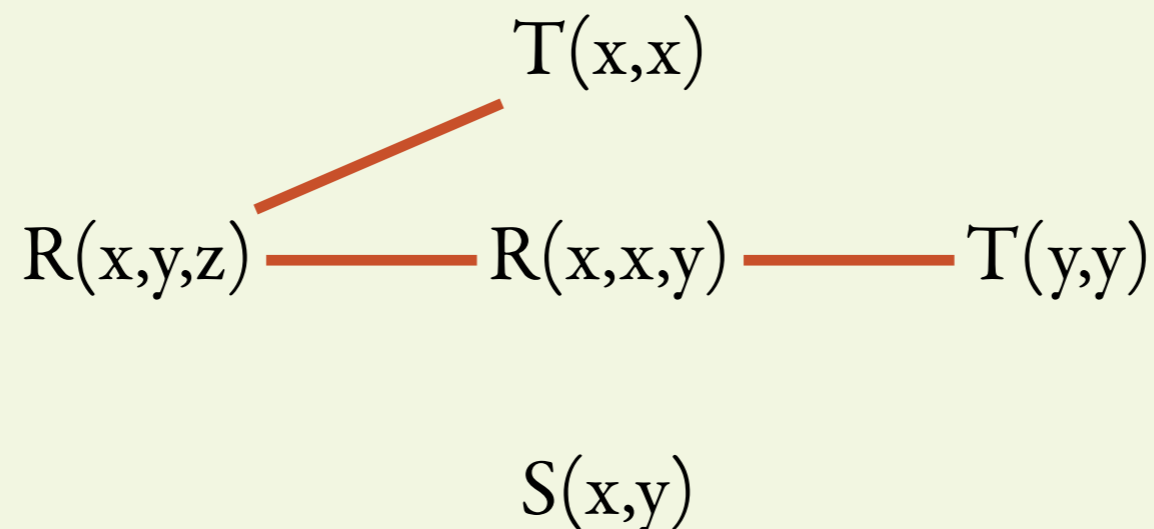
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Given the query $\phi = R_1(X_1) \wedge \dots \wedge R_n(X_n)$

Consider its canonical structure G_ϕ

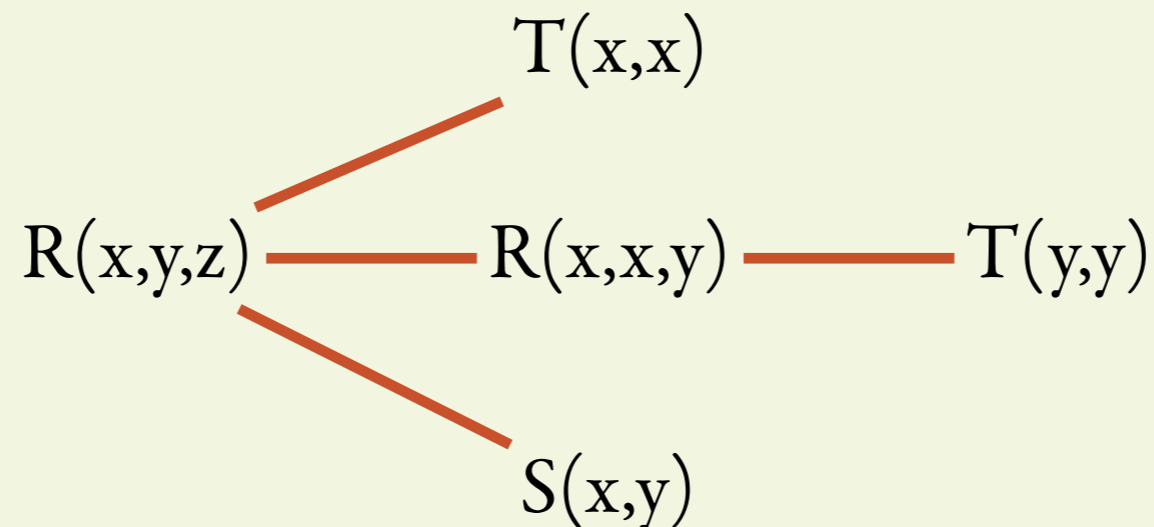
For $R_i(X_i)$ an ear with witness $R_j(Y_j)$

Put an edge between $R_i(X_i)$ and $R_j(X_j)$, and remove R_i from ϕ .

Repeat.

E.g.

$R(x,y,z), \cancel{S(x,y)}, \cancel{T(x,x)}, \cancel{R(x,x,y)}, \cancel{T(y,y)}$



Acyclic CQ's

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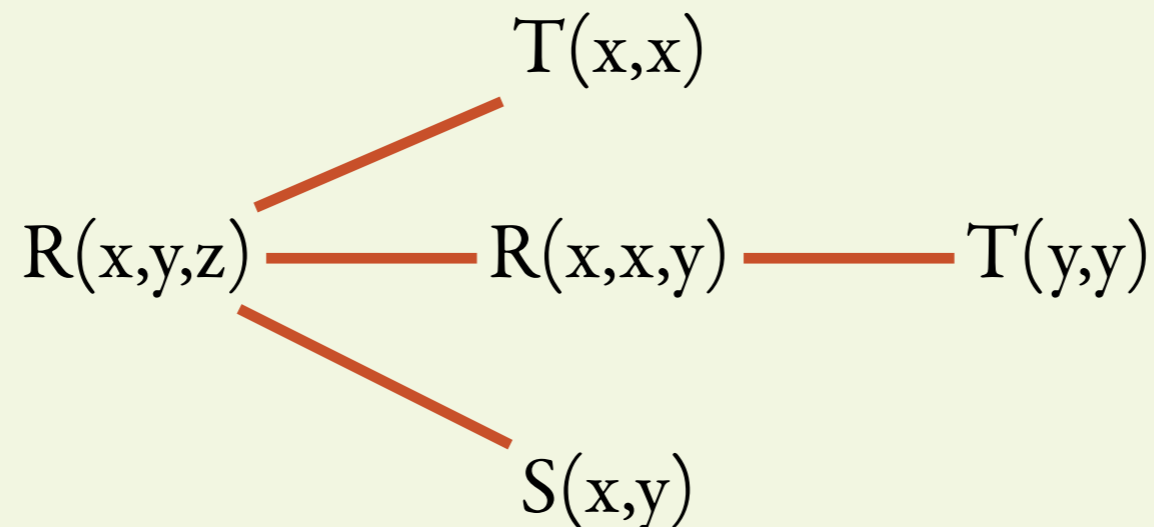
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Remove ears
until you're left
with only one!



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Acyclic CQ's

[Gottlob, Leone, Scarcello]

- Evaluation problem for boolean ACQ's is LOGCFL-complete
- $NL \subseteq LOGCFL \subseteq AC^1 \subseteq NC^2 \subseteq P$

the class of problems
logspace-reducible to
a context-free language

Beyond acyclic CQ's

Treewidth = a measure of the cyclicity of (hyper-)graphs

$$\text{tw} : \text{CQ} \longrightarrow \mathbb{N}$$

For a fixed k ,

the evaluation pb for queries of $\text{tw} \leq k$
can be done in **polynomial time**.

[Chekuri, Rajaraman]

Idea: the lower $\text{tw}(\phi)$, the more ϕ resembles a tree

Tree-width, definition

A **tree decomposition** of a graph G :

A bunch of graphs with a special edge " \dots " between their nodes so that

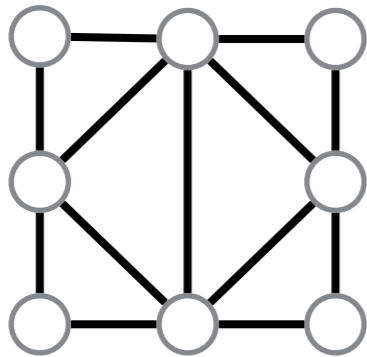
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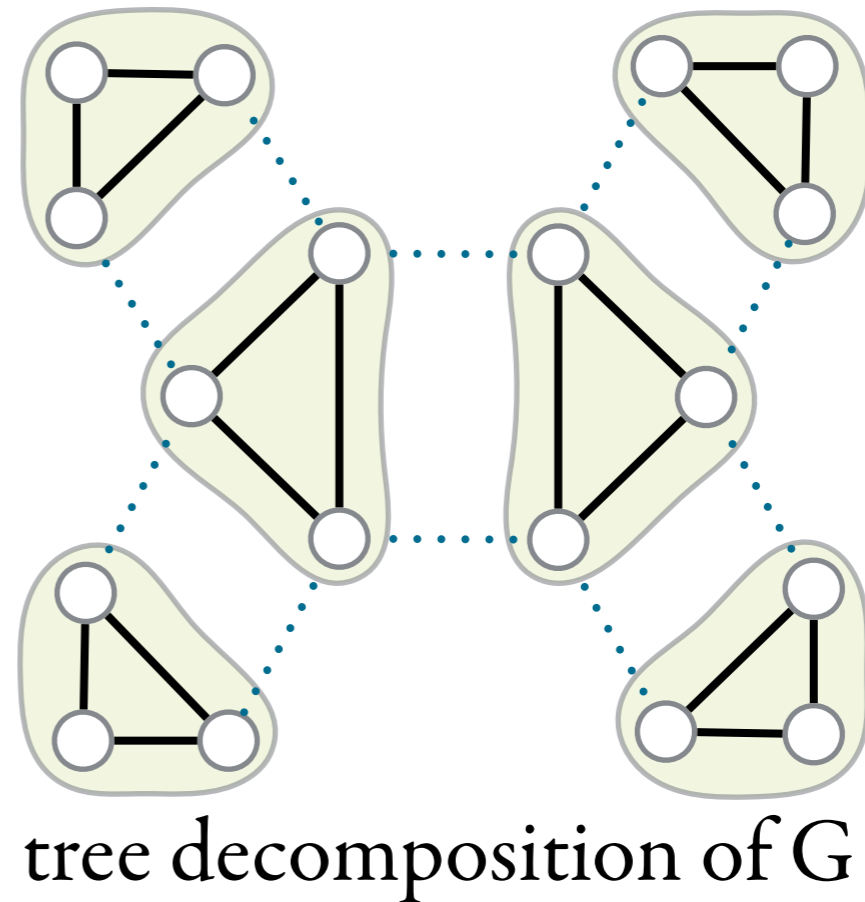
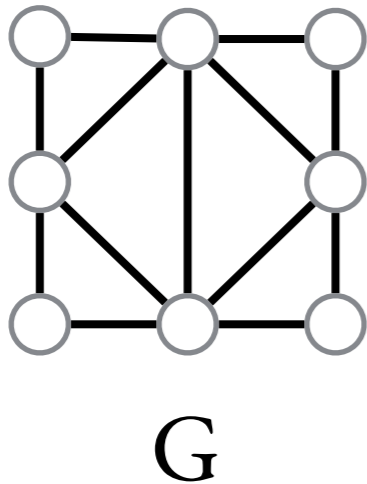
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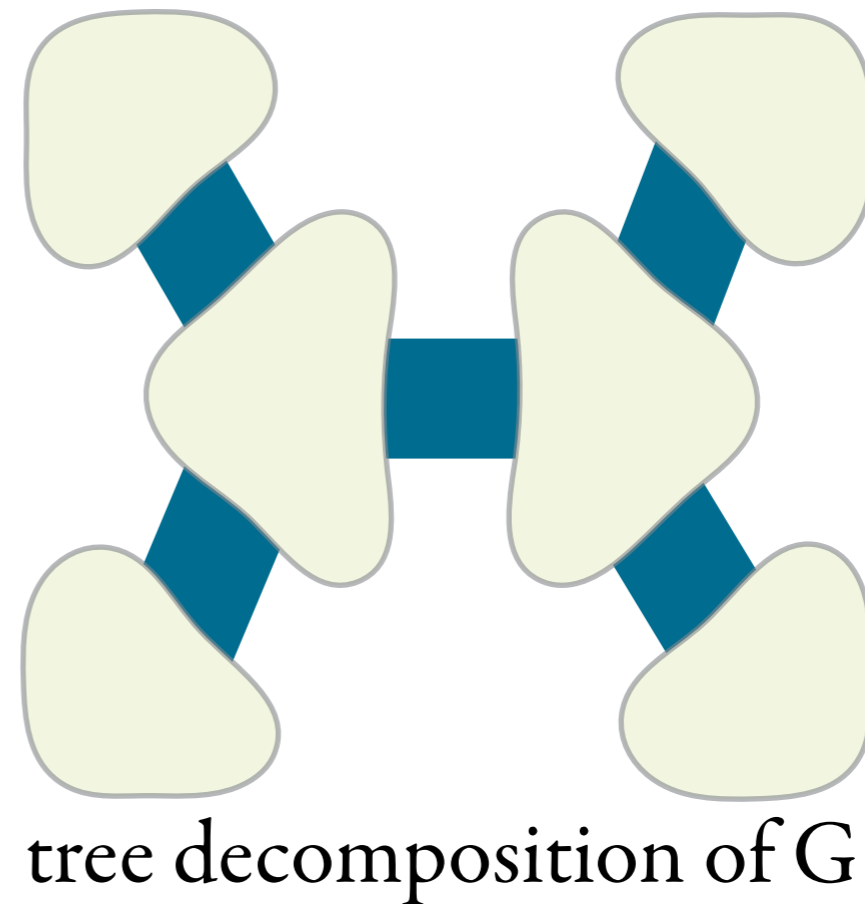
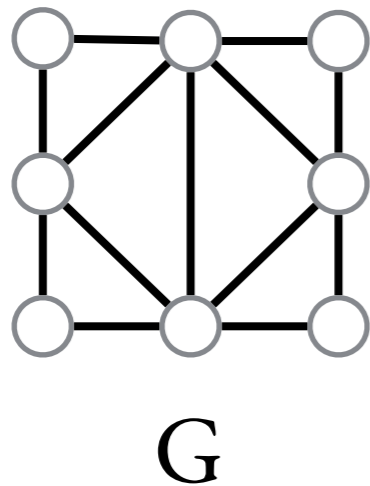


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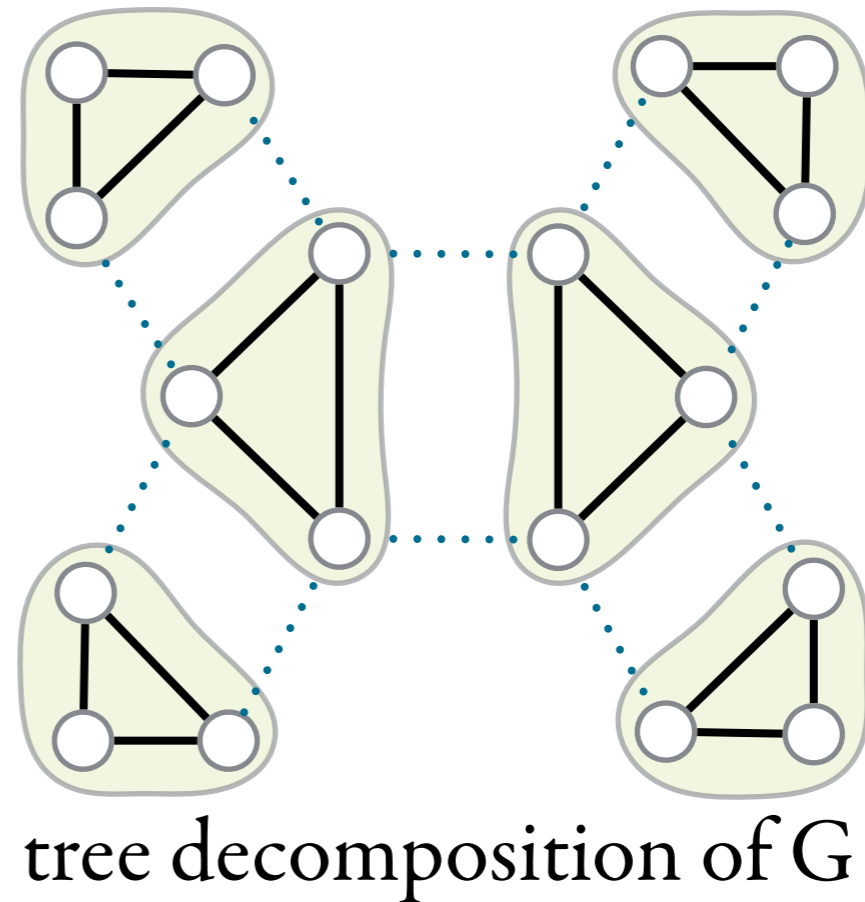
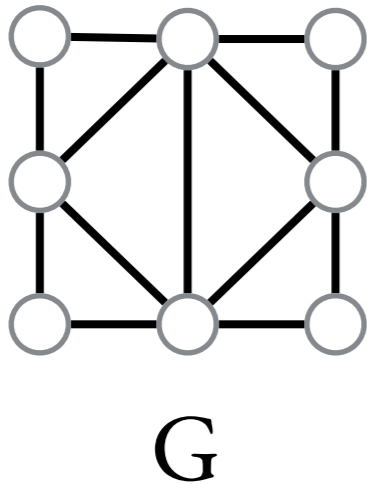


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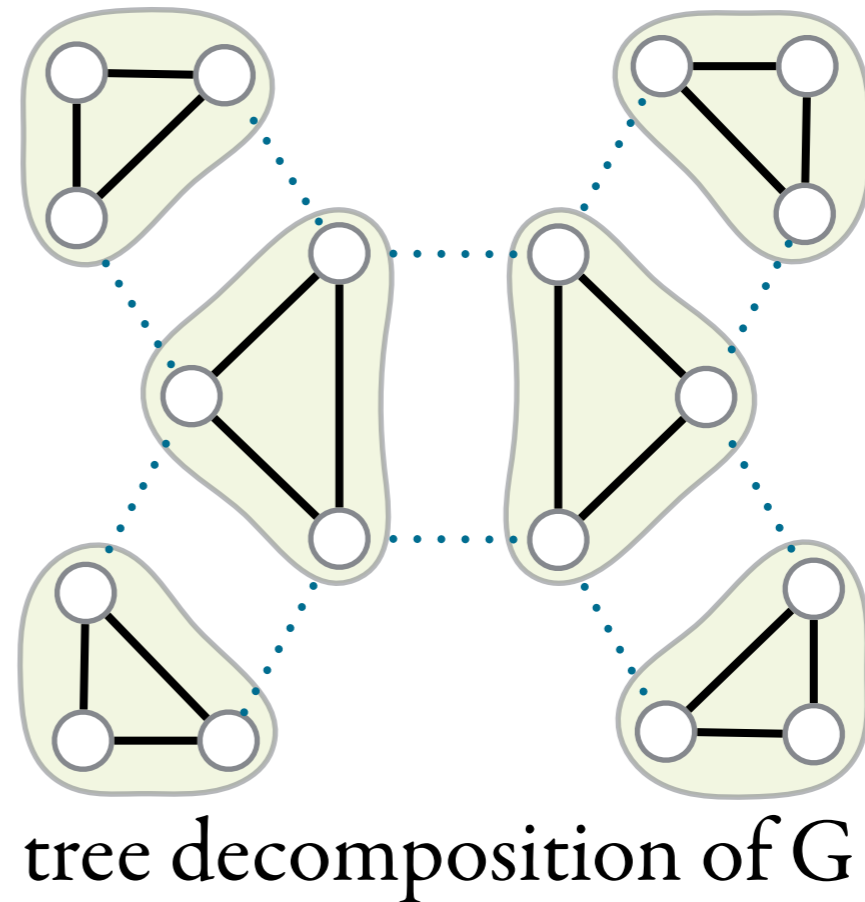
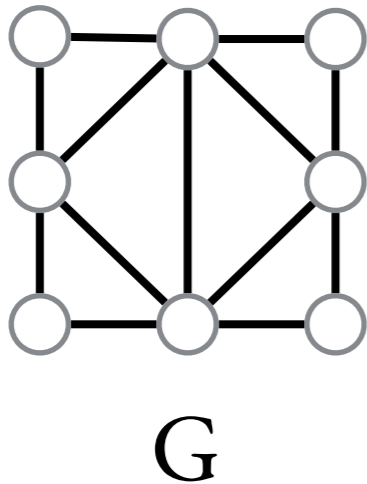


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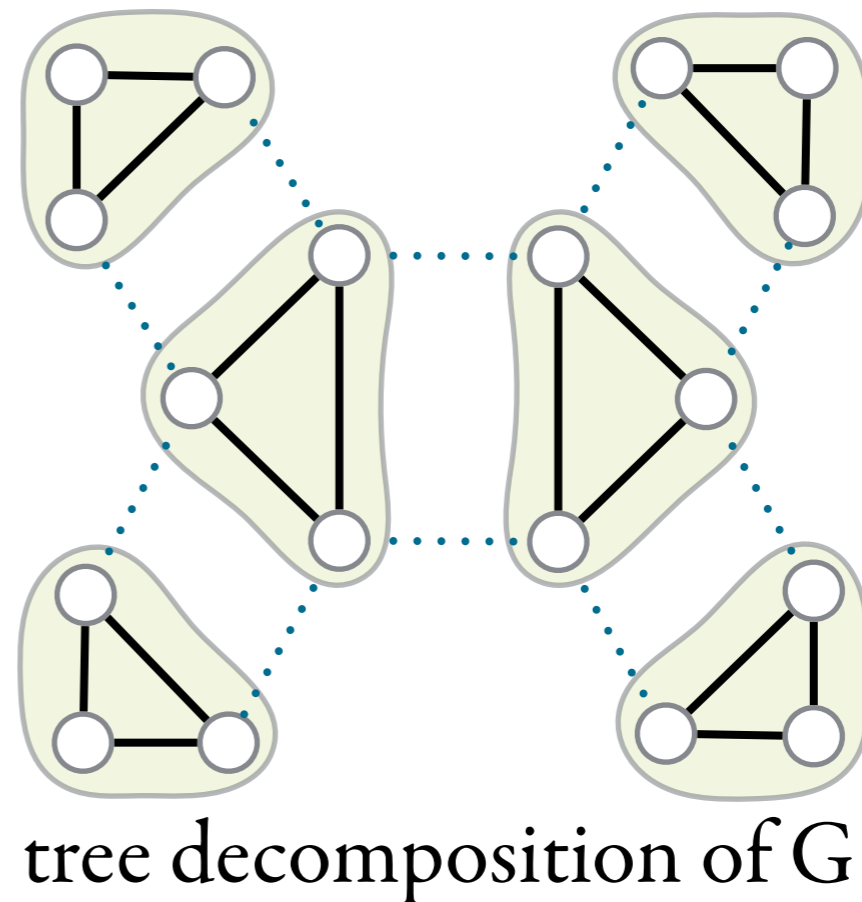
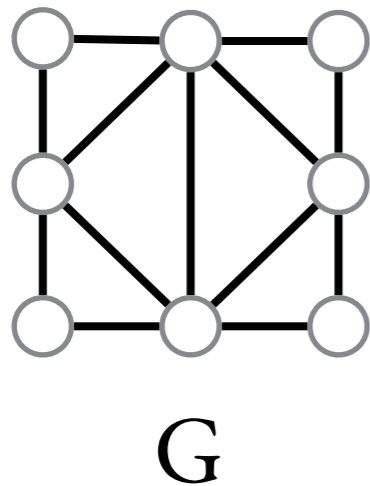
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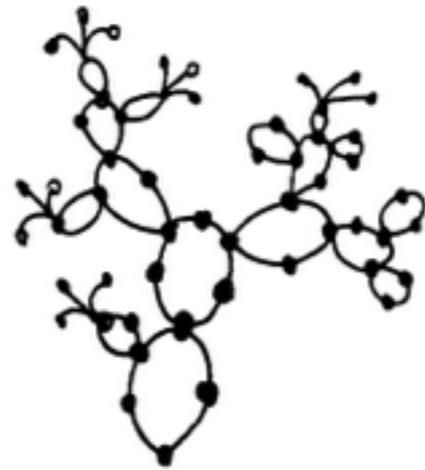


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tree-width of G = minimum width of decomposition of G

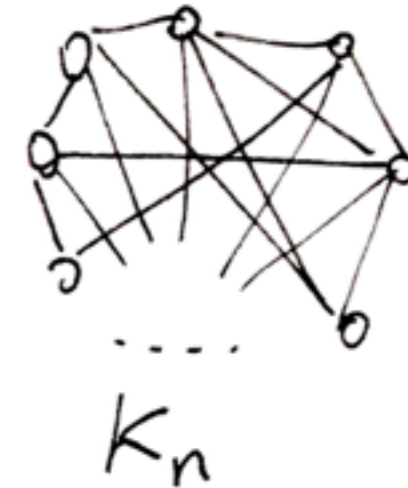
Tree-width, examples

(a tree)



tree-width 1

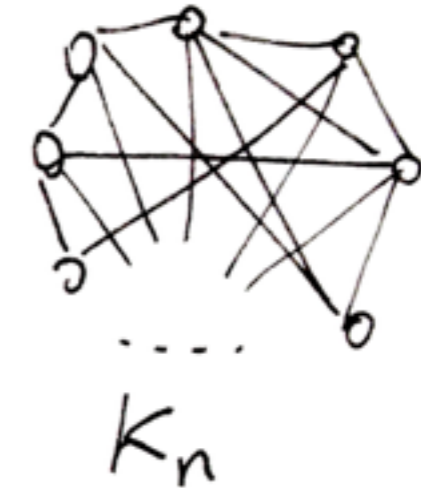
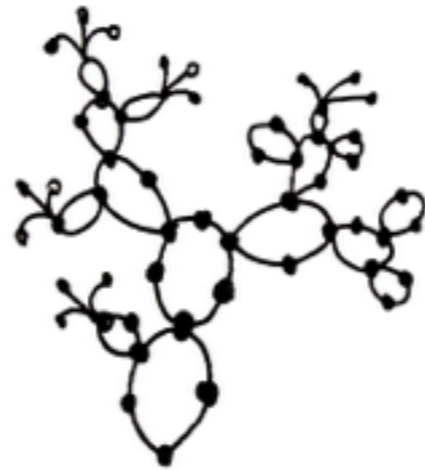
tree-width 2



tree-width $n-1$

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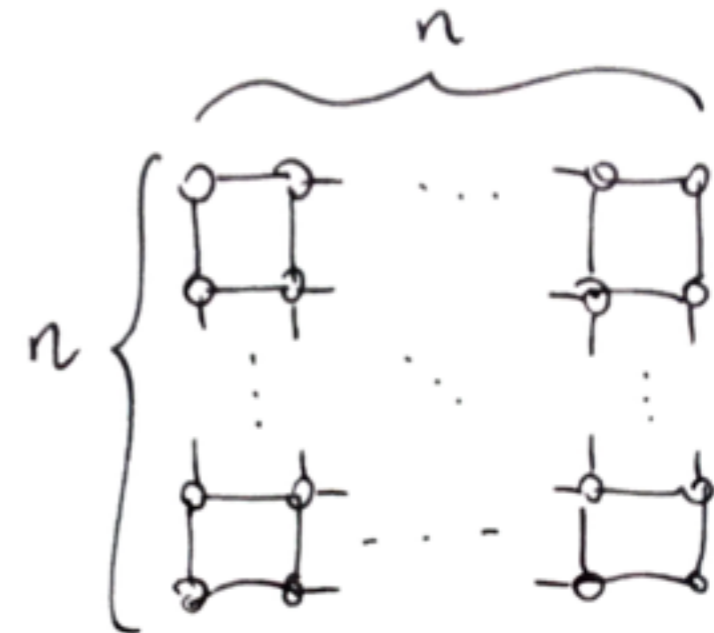
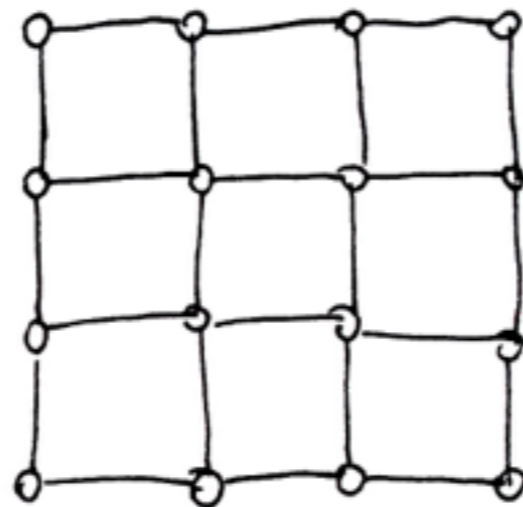
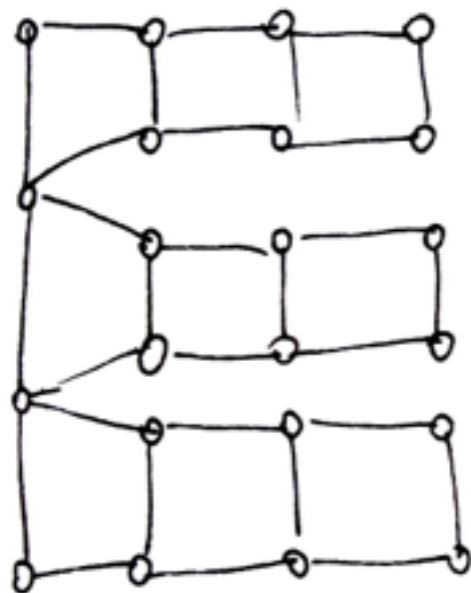
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tree-width 1

tree-width 2

tree-width $n-1$



tree-width 2

tree-width 4

tree-width n

Tree-width of structures, queries

tree-width of CQ = tree-width of its canonical structure

tree-width of structure = tree-width of Gaifman graph

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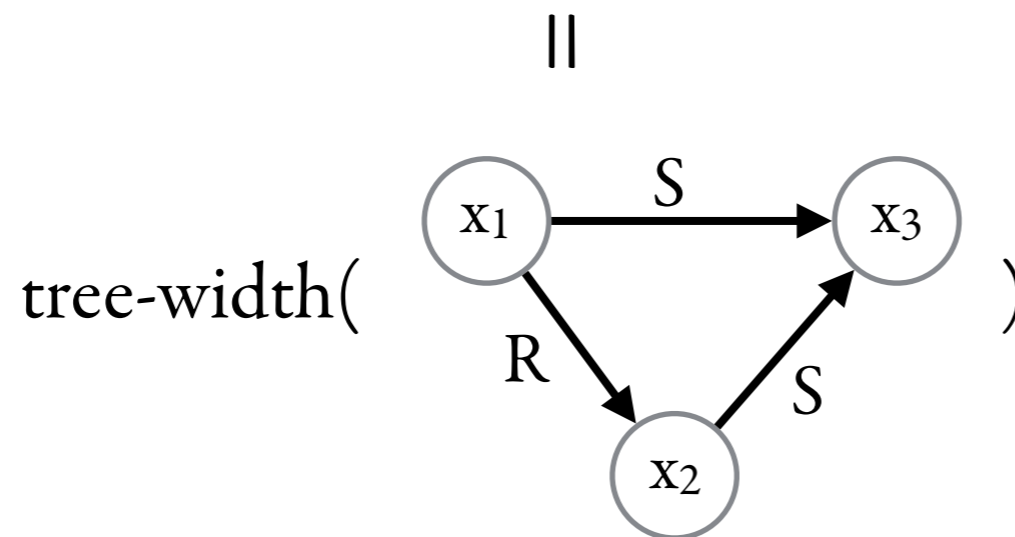
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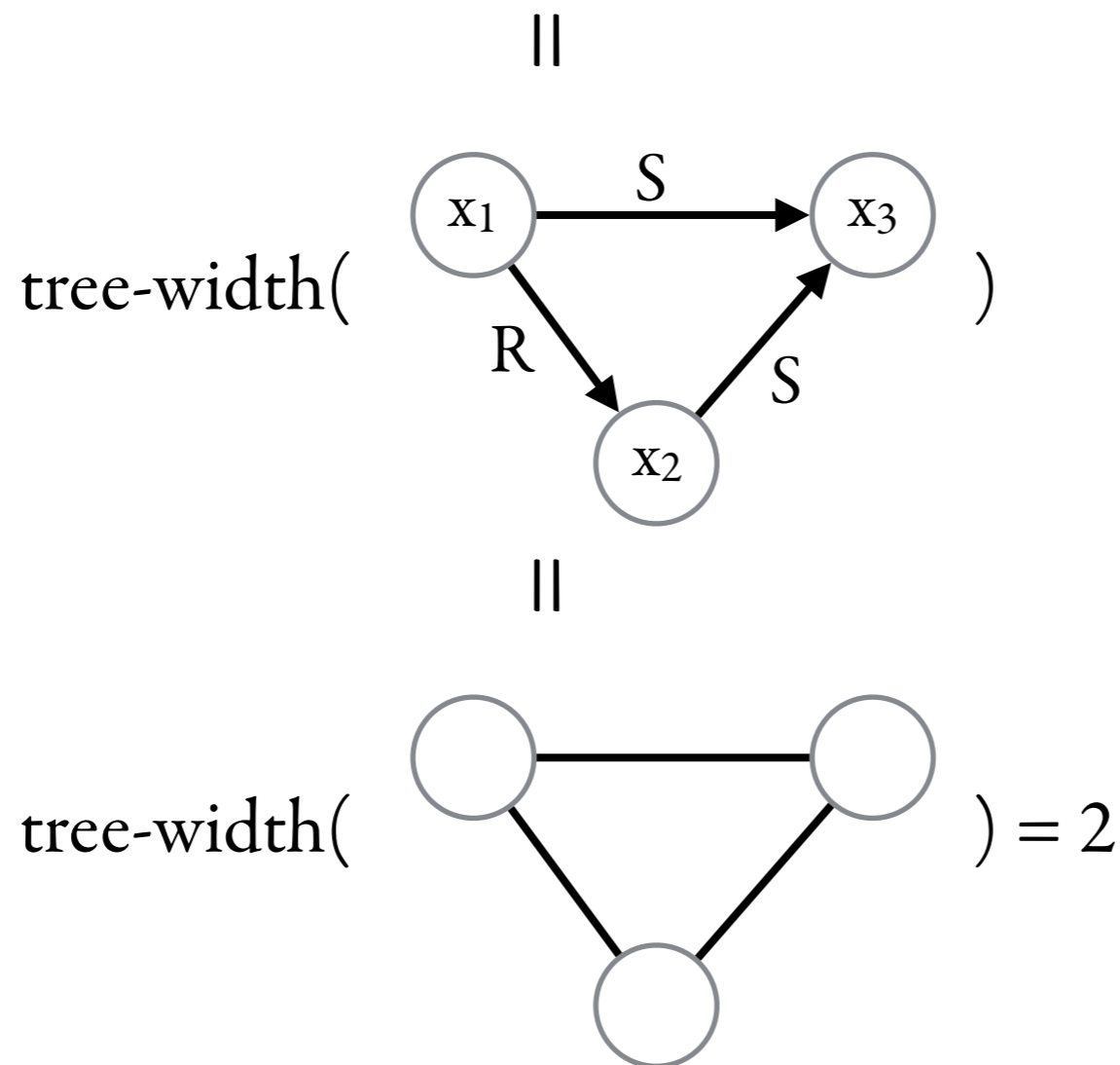
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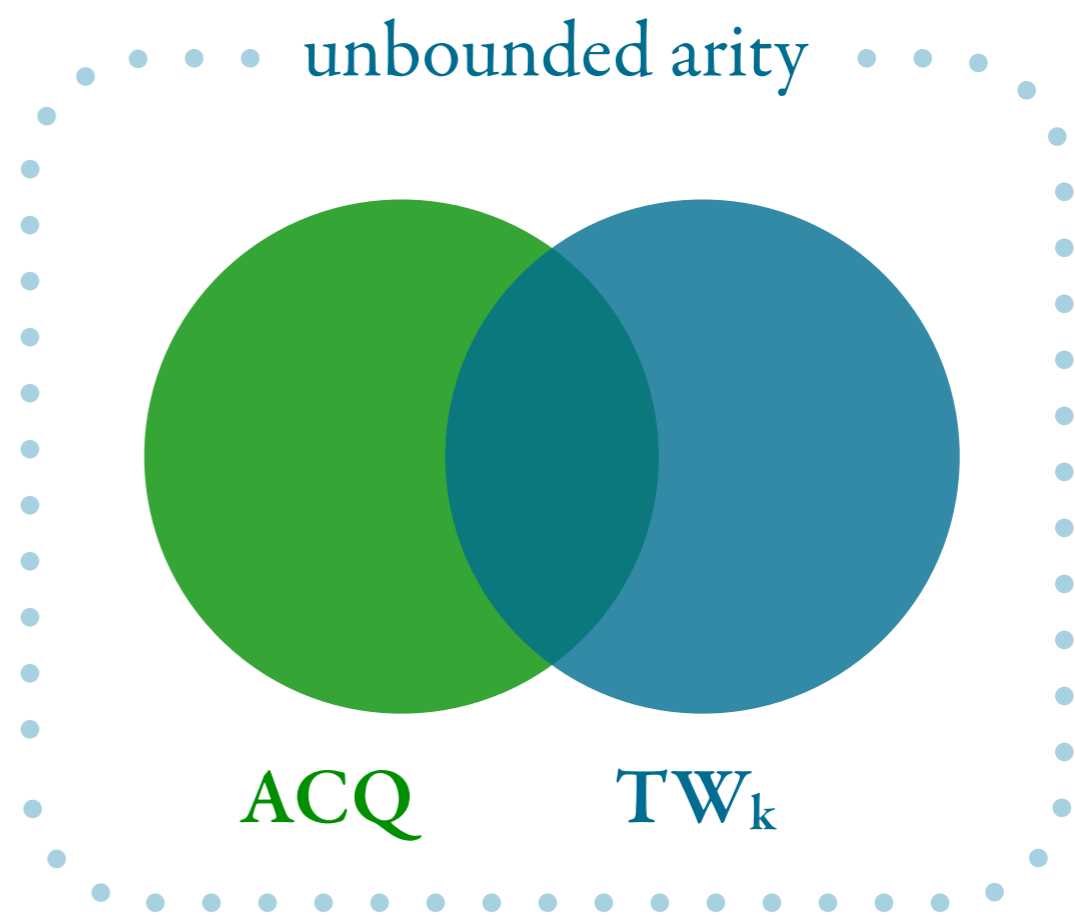
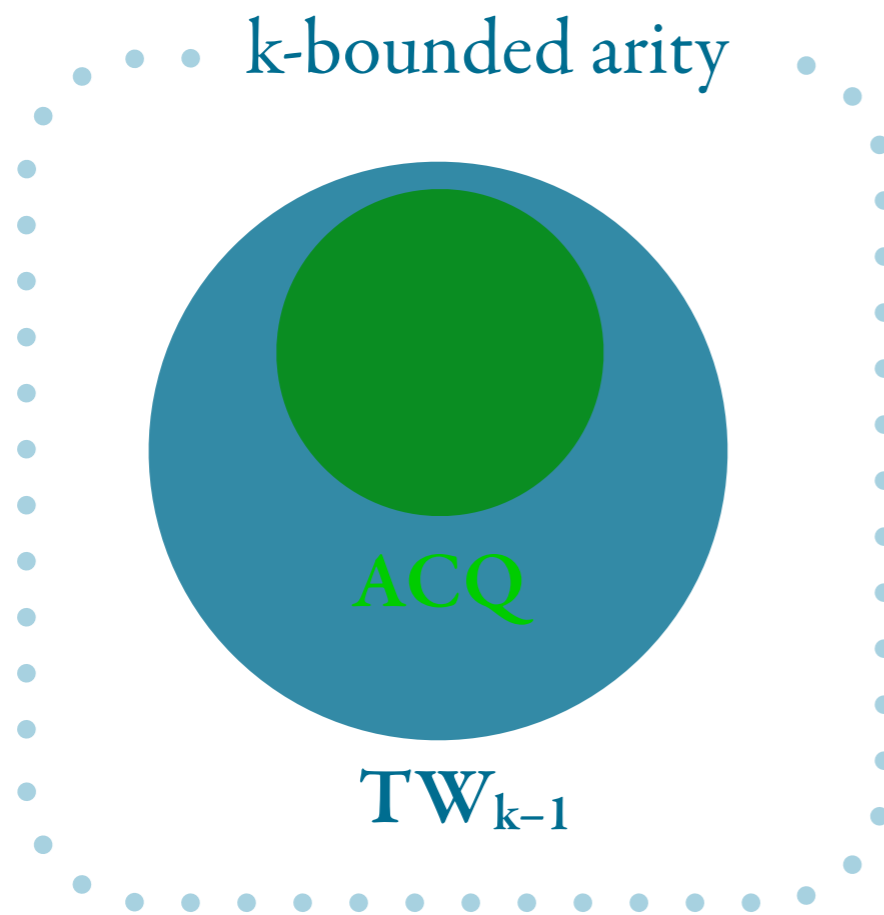
Beyond acyclic CQ's

For a fixed k ,

- computing whether $\phi \in \text{CQ}$ has $\text{tw} \leq k$
 - calculating a tree decomposition
- can be done in **linear time**.

[Bodlaender]

Tree-width vs. Acyclicity



Beyond acyclic CQ's

CQ's with bounded treewidth can be evaluated in PTIME

[Chekuri, Rajaraman, Gottlob, Leone, Scarcello]

Beyond acyclic CQ's

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CQ's can be evaluated in PTIME iff they have bounded tree width!

[Grohe, Schwentick, Segoufin]

Querying with semi-joins

The semi-join

$$R \bowtie_{\{i_1=j_1, \dots, i_n=j_n\}} S = \{ (x_1, \dots, x_n) \in R \mid \text{there is } (y_1, \dots, y_m) \in S \\ \text{where } x_{i_k} = y_{j_k} \text{ for all } k \}$$

The **semi-join algebra (SA)**: variant of RA with operations:

$$\bowtie, \cup, \pi, \sigma, \setminus, \textit{dupcol}$$

Output at most linear in the database. Further,

The evaluation problem for SA is in $O(|\phi| \cdot |D|)$

Logical characterisation: “stored-tuples guarded fragment of FO”

Acyclic CQs:

- every intermediate relation is **linear** in $|D|$
- we apply $|\phi|$ semi-joins

↪ What if we allow intermediate relations to be **polynomial** in $|D|$?

Bounded variable FO

Def.

FO^k = The fragment of FO restricted to k variable names

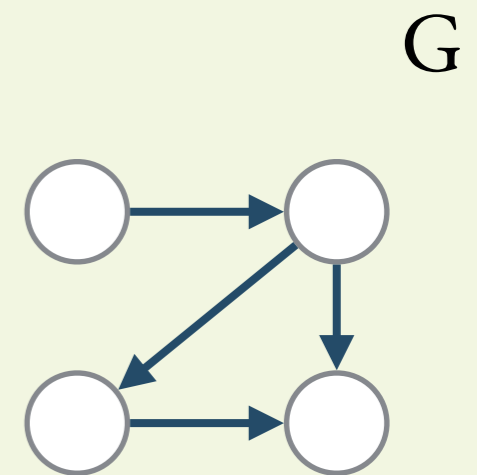
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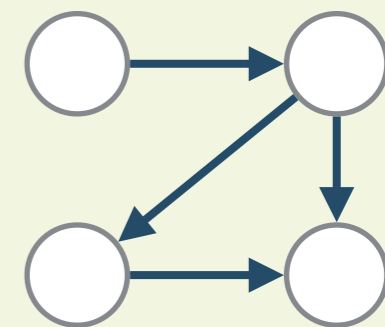
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Question: in FO^2 ?



G

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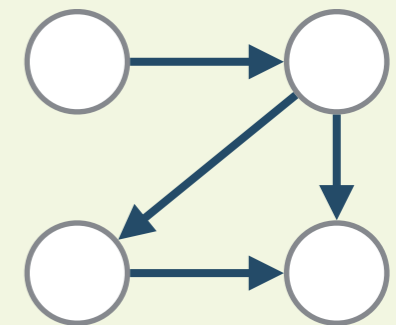
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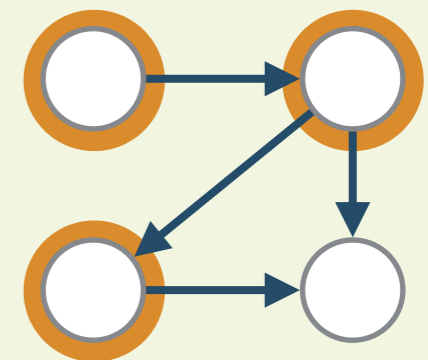
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PTIME

G



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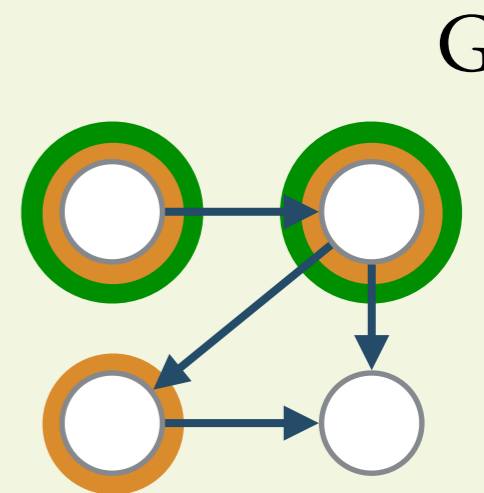
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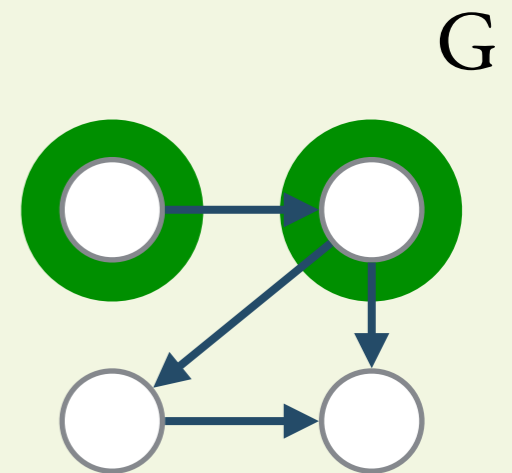
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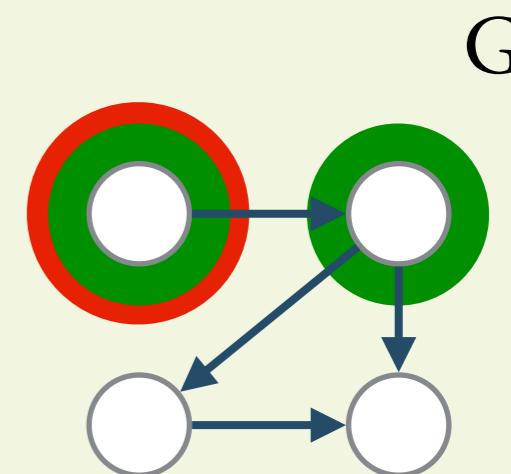
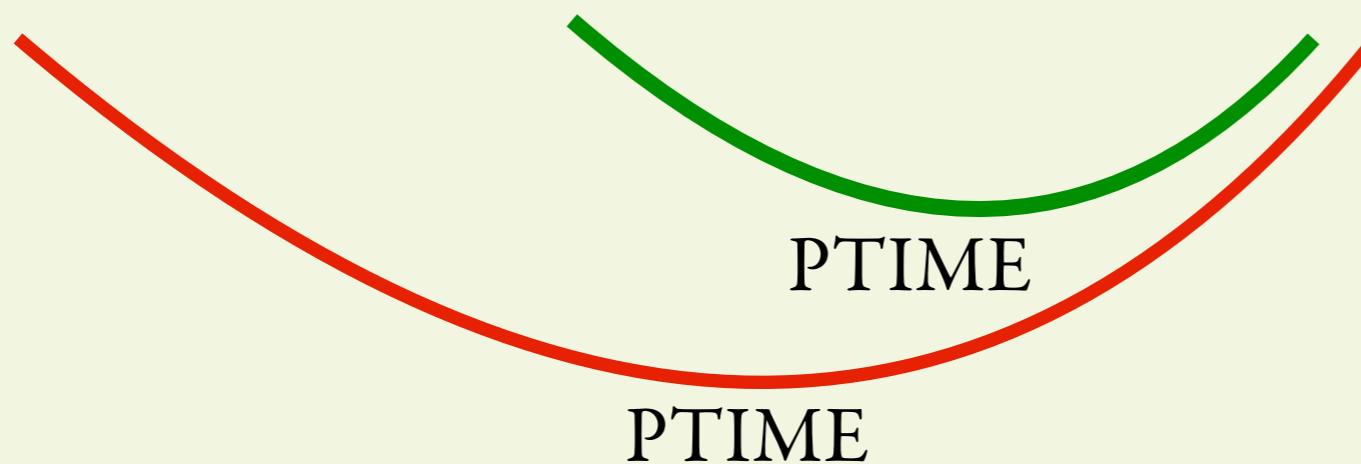
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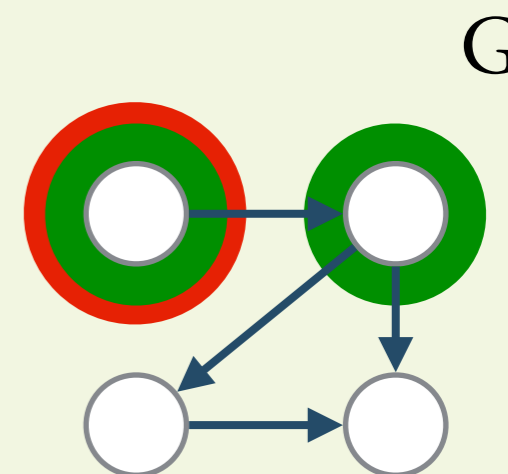
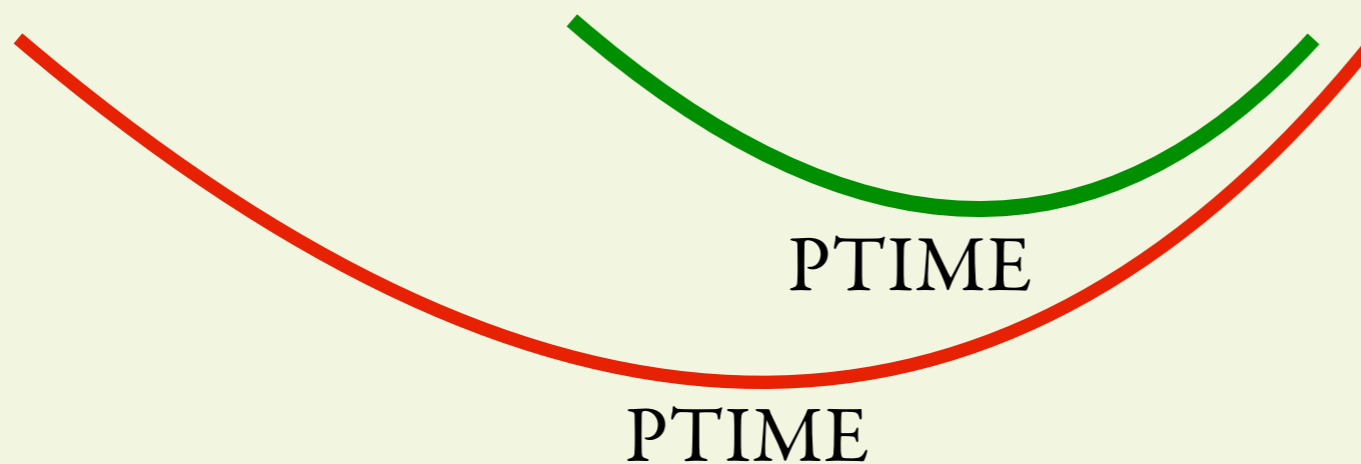
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qr 2

...

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4. ...

⋮

r

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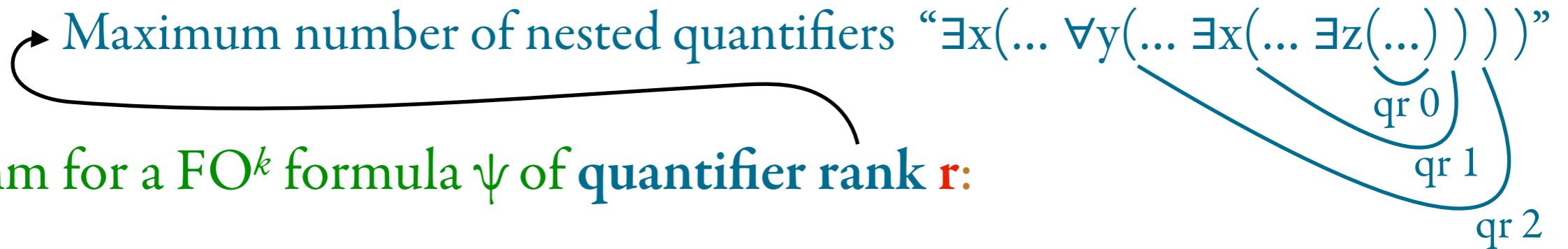
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Bounded variable FO

Desirable:

- Given k and a FO query ϕ , is ϕ in FO^k ?   Undecidable (even w.o. \neg)


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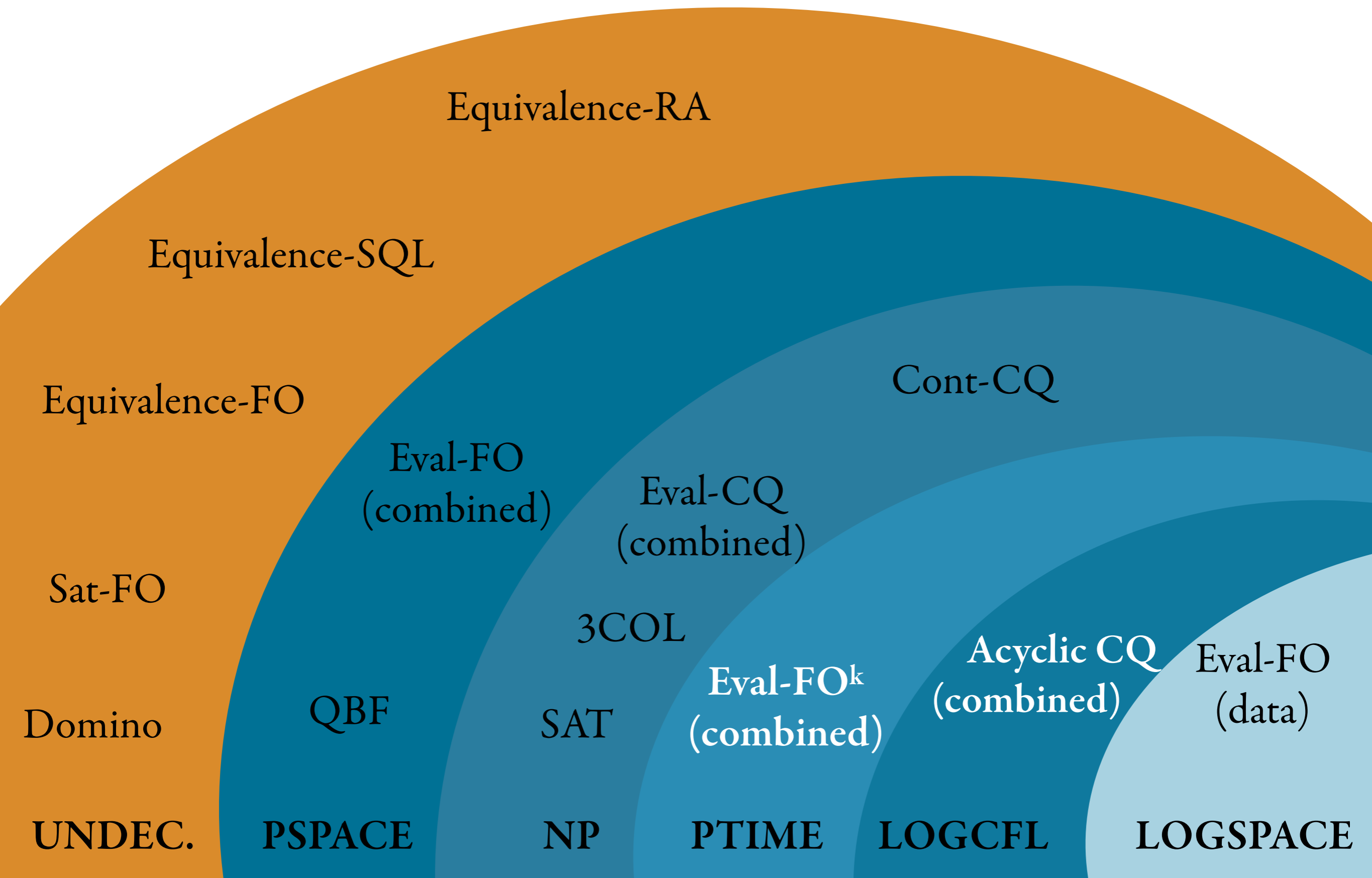
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- Satisfiability for FO^k
 - \rightsquigarrow Undecidable if $k \geq 3$ (Domino)
 - \rightsquigarrow NEXPTIME-complete if $k=2$

Recap



Definability in FO

Goal: check which properties / queries are *expressible in FO*

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Example. $Q(G) = \{ (u, v) \mid G \text{ contains a path from } u \text{ to } v \}$

Is Q expressible as a first-order formula?

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Quantifier rank \neq quantity of quantifiers

Eg, in $\phi_0(x, y) = E(x, y)$, and

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$\text{qr}(\phi_k) = k$ but # quantifiers of ϕ_k is 2^k

Definability in FO

Definition. **Quantifier rank** of ϕ = max number of nested quantifiers in ϕ .

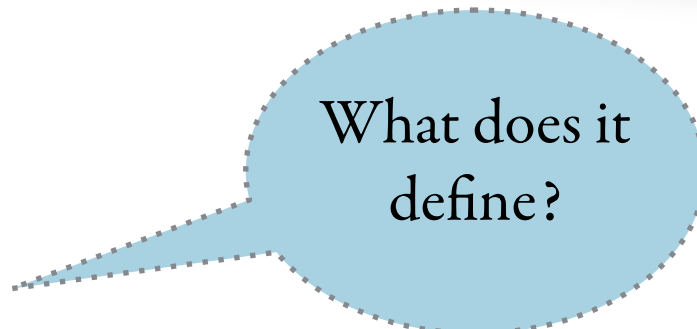
Example. $\phi = \forall x \forall y \left(\neg E(x,y) \vee \exists z \left((E(x,z) \vee E(z,x)) \wedge (E(y,z) \vee E(z,y)) \right) \right)$
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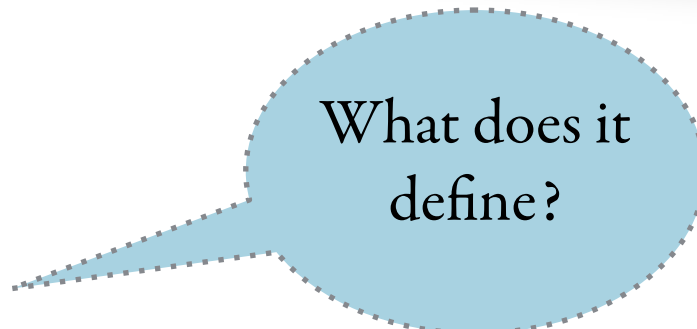
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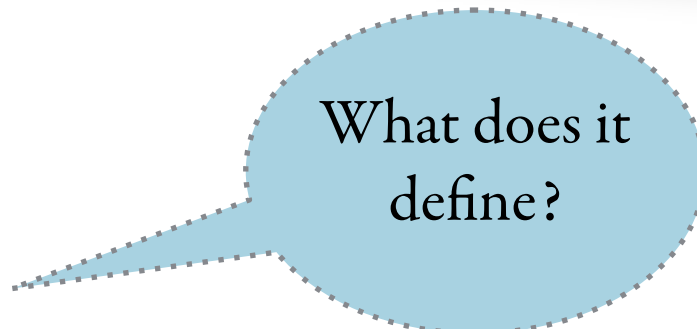
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Sub-goal: Given a property P and a number n ,
tell whether P is expressible by a sentence of quantifier rank at most n .

Definability in FO

Definition. Two structures S_1 and S_2 are **n -equivalent**
iff

they satisfy the same FO sentences of quantifier rank $\leq n$
(i.e. $S_1 \models \phi$ iff $S_2 \models \phi$ for all $\phi \in \text{FO}$ with $\text{qr}(\phi) \leq n$)

[Tarski '30]

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[Tarski '30]

Consider a property (i.e. a set of structures) \mathbf{P} .

Suppose that there are $S_1 \in \mathbf{P}$, $S_2 \notin \mathbf{P}$ s.t.

S_1 and S_2 are n -equivalent.

Then \mathbf{P} is *not expressible* by any sentence of quantifier rank n .

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Example. $\mathbf{P} = \{ \text{structures of even size} \}$ seems to be not FO-definable.

One could then aim at proving that

for all n there are $S_1 \in \mathbf{P}$ and $S_2 \notin \mathbf{P}$ s.t. S_1, S_2 n -equivalent...

Expressive power via games

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Characterisation of the expressive power of FO in terms of **Games**

Expressive power via games

Characterisation of the expressive power of FO in terms of **Games**

Idea: For every two structures (S, S') there is a game where

a player of the game has a **winning strategy**

iff

S, S' are **indistinguishable**

Ehrenfeucht-Fraïssé games

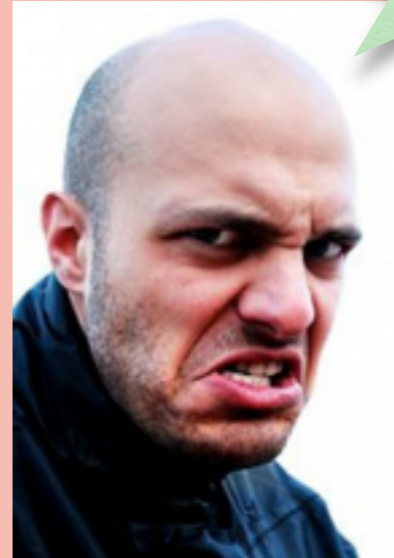
A game between two players

S_1 and S_2 are
 n -equivalent!



Duplicator

No they're
NOT!!!!



Spoiler

Board: (S_1, S_2)

One player plays in one structure, the other player answers in the other structure.

If Duplicator can ensure not losing after n rounds: S_1, S_2 are n -equivalent

Ehrenfeucht-Fraïssé games

Definition. Partial isomorphism between S_1 and S_2 = **injective** partial map

f: nodes of S_1 \longrightarrow nodes of S_2

so that

$E(x,y)$ **iff** $E(\mathbf{f}(x), \mathbf{f}(y))$

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Spoiler

and

Duplicator

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Spoiler and **Duplicator** play for n rounds on the board S_1, S_2

At each round i :

1. **Spoiler** chooses a node x_i from S_1
and **Duplicator** answers with a node y_i from S_2 ,

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At each round i :

1. **Spoiler** chooses a node x_i from S_1
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or

2. **Spoiler** chooses a node y_i from S_2
and **Duplicator** answers with a node x_i from S_1 ,

Ehrenfeucht-Fraïssé games

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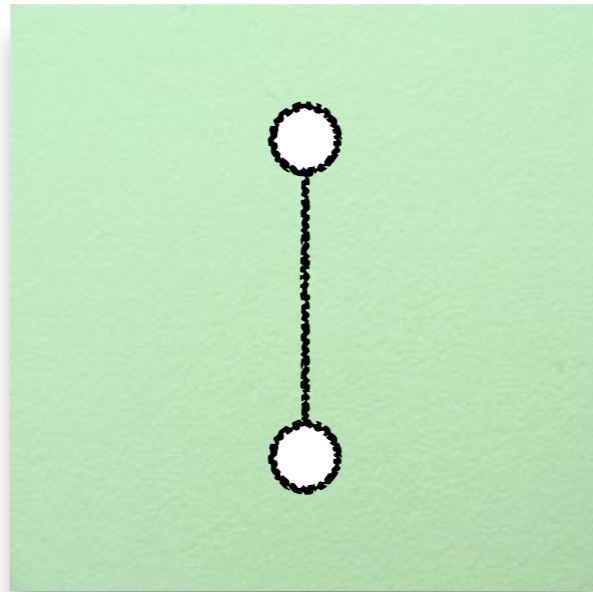
or

2. **Spoiler** chooses a node y_i from S_2
and **Duplicator** answers with a node x_i from S_1 ,

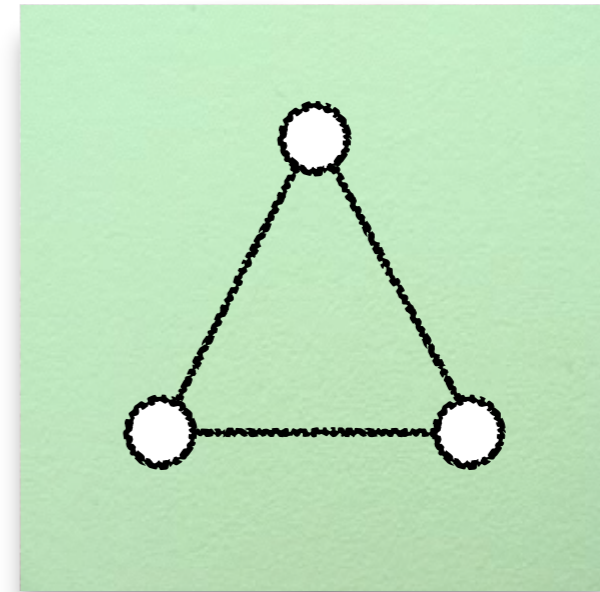
or **Spoiler** wins if $\{x_i \mapsto y_i \mid 1 \leq i \leq n\}$ is not a partial isomorphism between S_1 and S_2 .

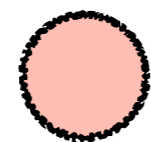
Ehrenfeucht-Fraïssé games

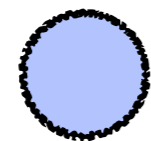
S_1



S_2

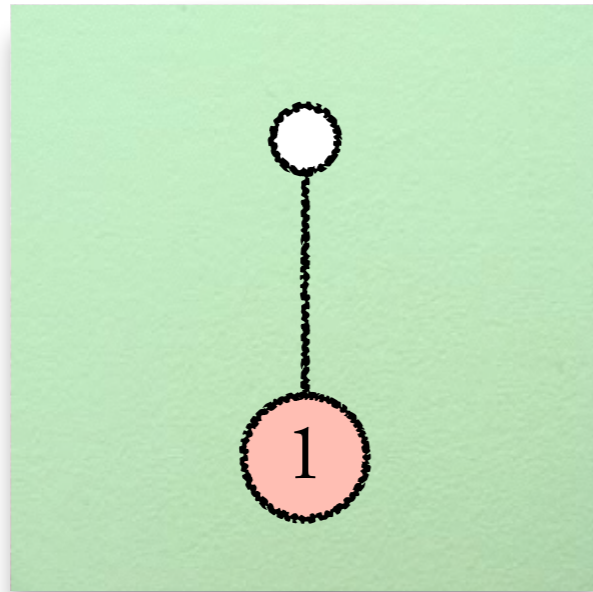


 = Spoiler

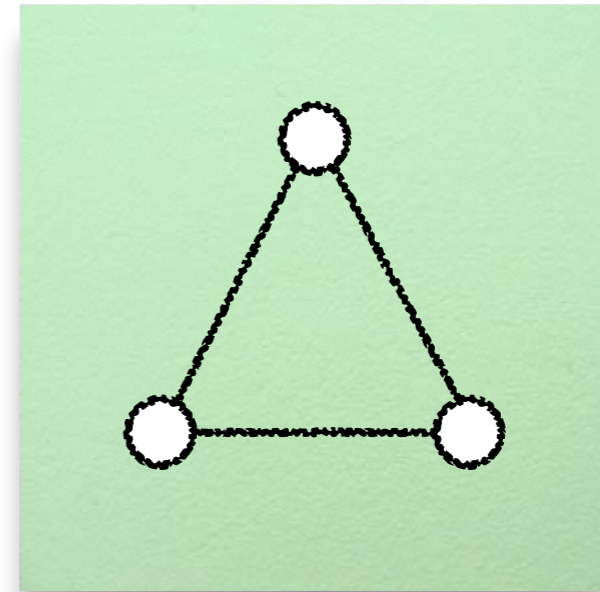
 = Duplicator

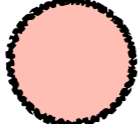
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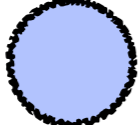
S_1



S_2

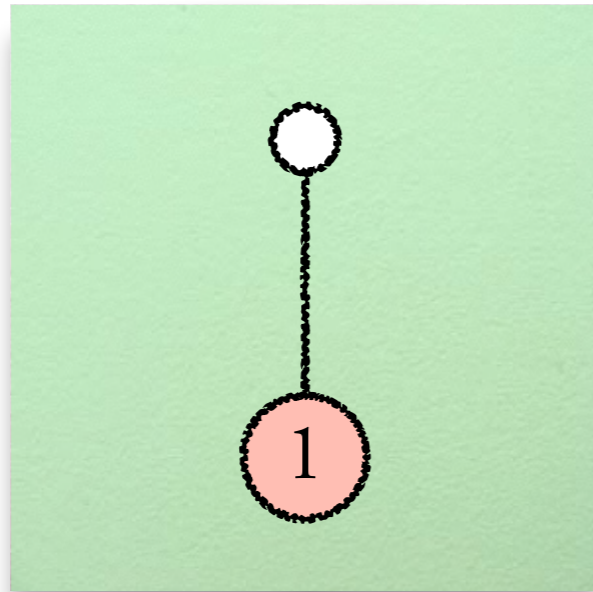


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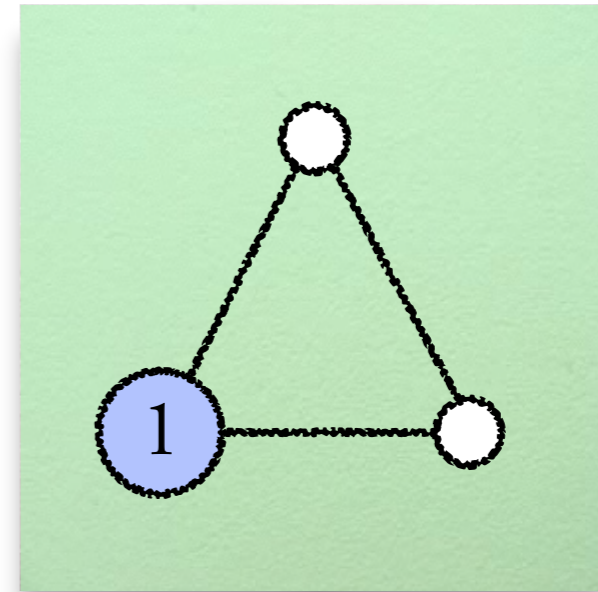
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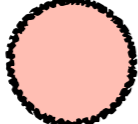
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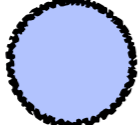
S_1



S_2

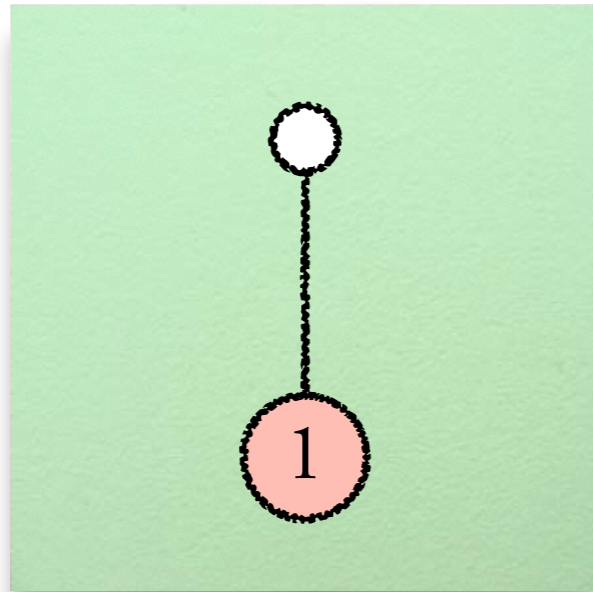


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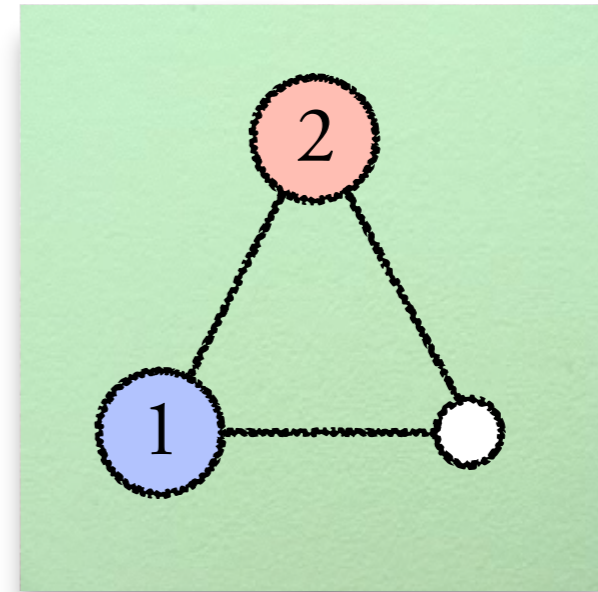
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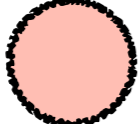
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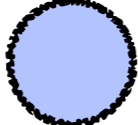
S_1



S_2

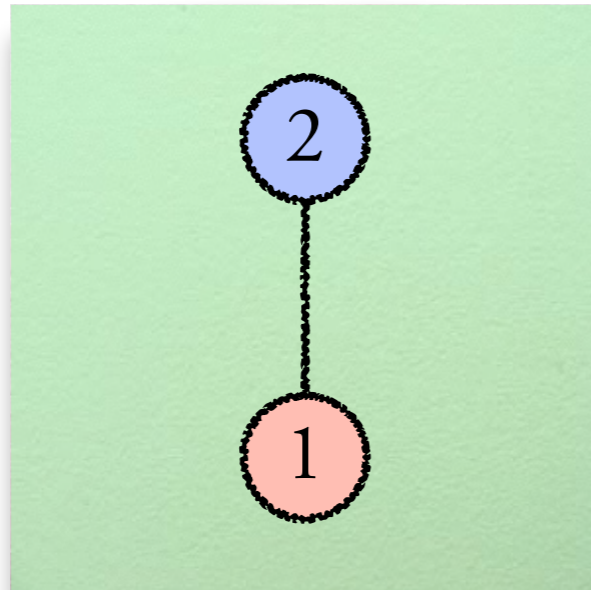


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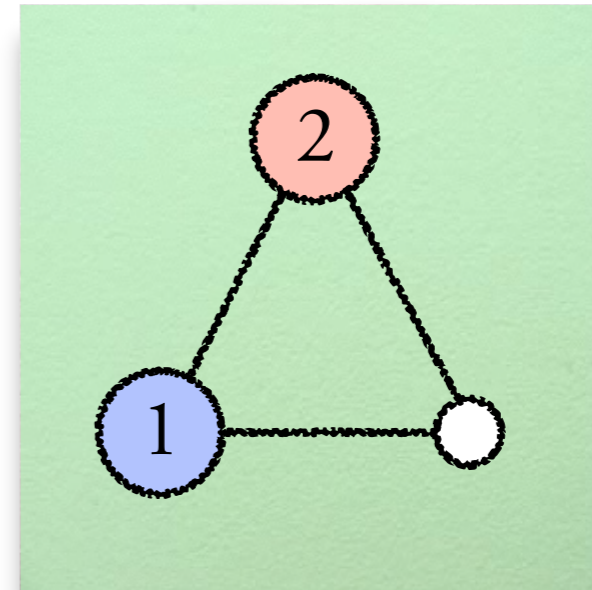
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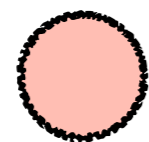
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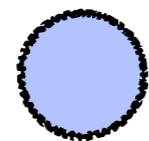
S_1



S_2

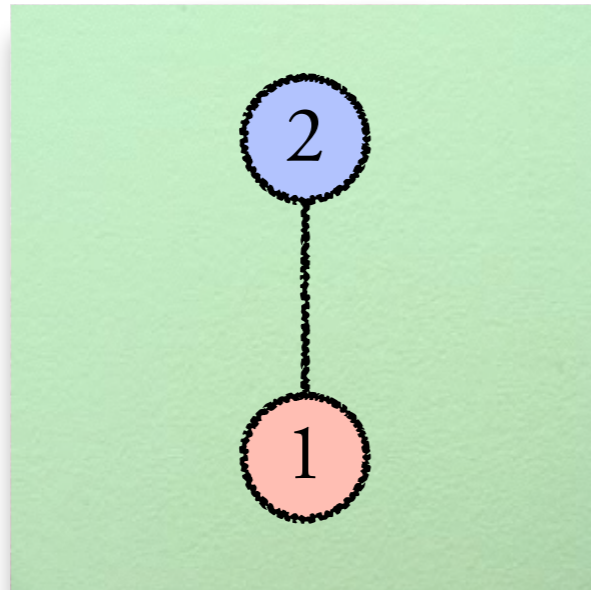


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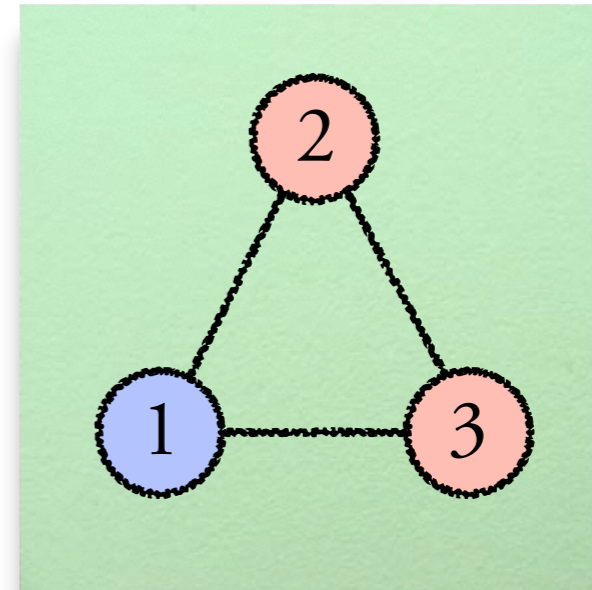
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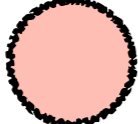
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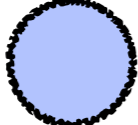
S_1



S_2



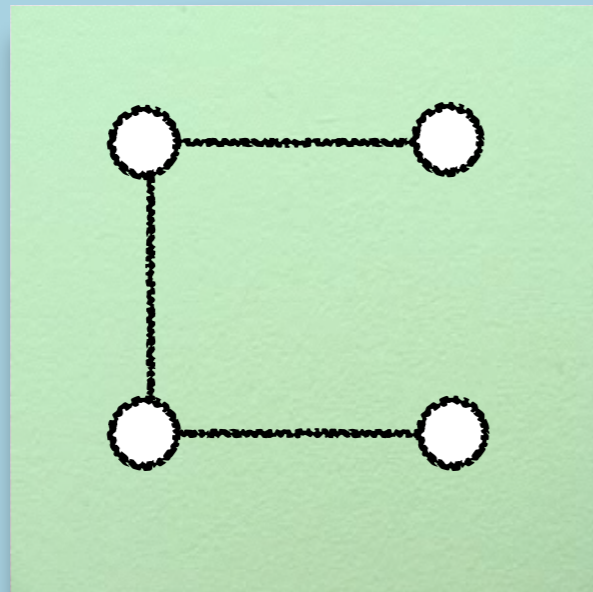
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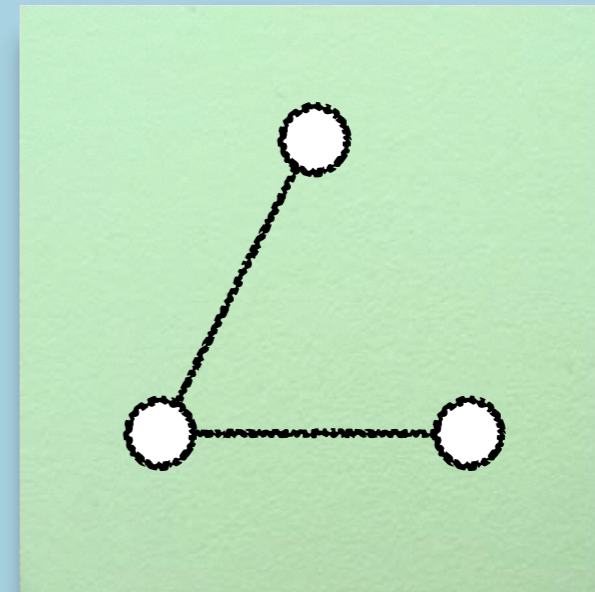
Ehrenfeucht-Fraïssé games

Question: Can Spoiler win in 3 rounds ?

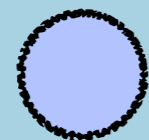
S_1



S_2



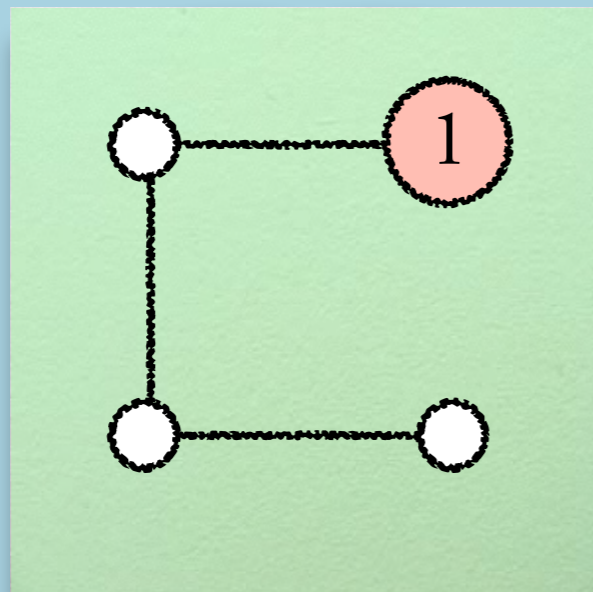
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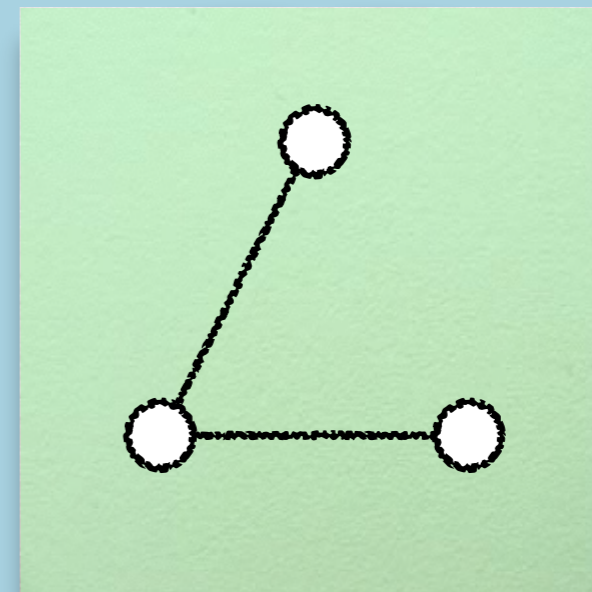
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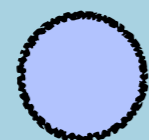
S_1



S_2



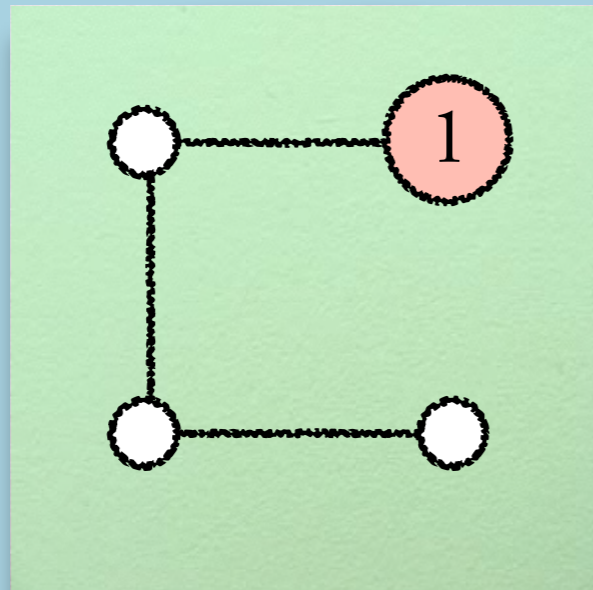
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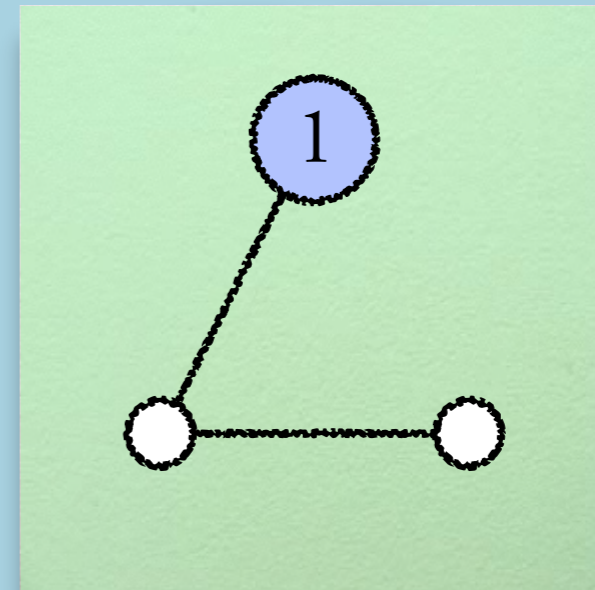
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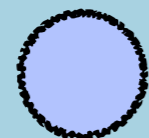
S_1



S_2



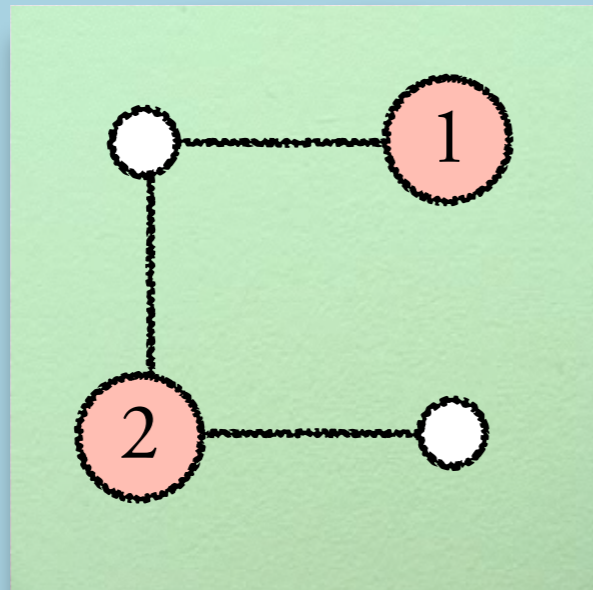
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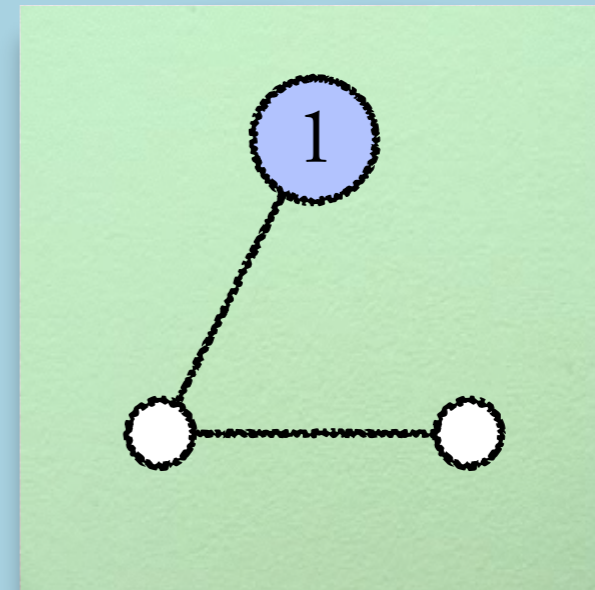
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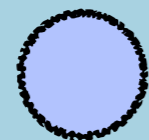
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S_2



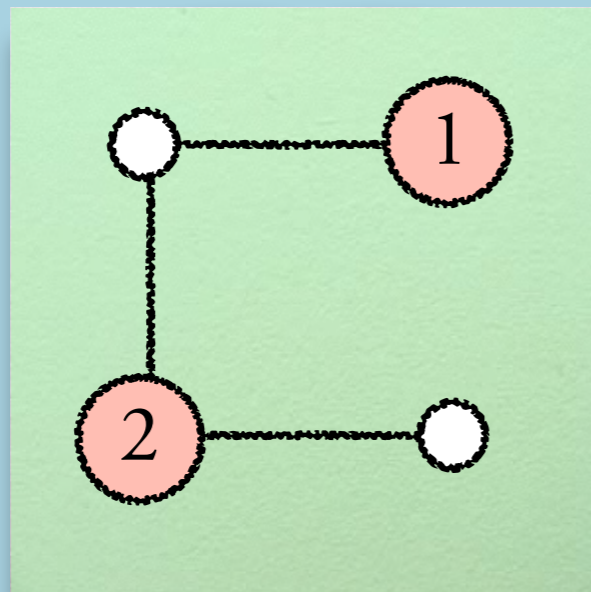
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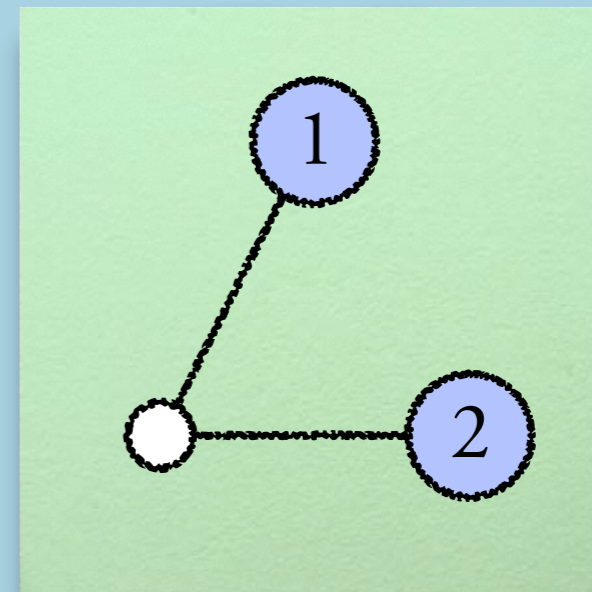
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S_1



S_2



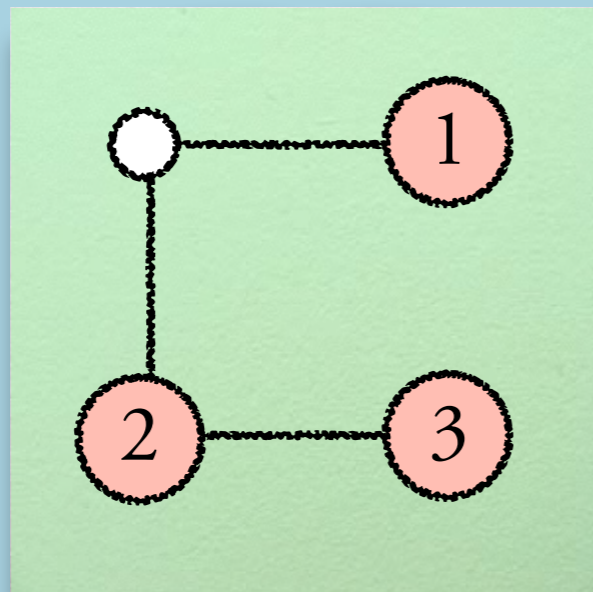
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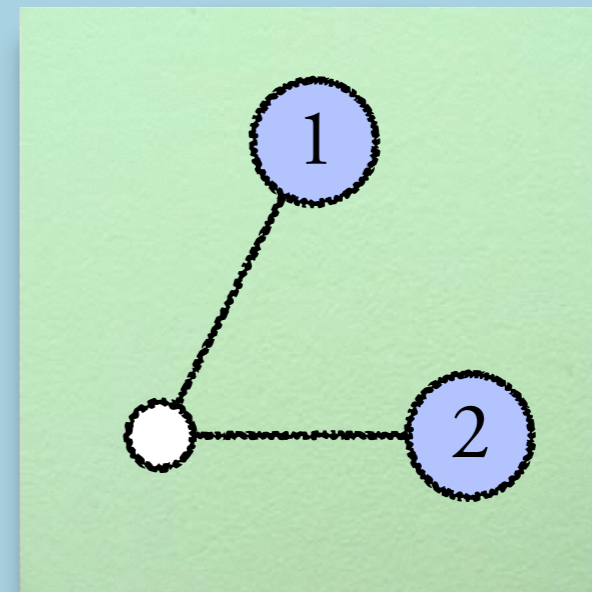
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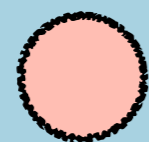
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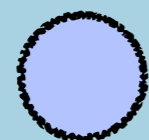
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