

Descriptive complexity of linear algebra

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*Logical Approaches to Barriers
in Computing & Complexity II*

Isaac Newton Institute

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Overview

Study **definability** of natural problems in linear algebra and **expressiveness** of logics with algebraic operators.

- Background & motivation
- Descriptive complexity of problems in linear algebra
- Logics with matrix-rank operators
- Pebble games for rank logics & the Weisfeiler-Lehman method

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A logic for NP

ESO — Existential second-order logic

Second-order variables existentially quantified,
followed by a first-order formula:

$$\exists R_1, \dots, R_k . \varphi(R_1, \dots, R_k)$$

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A decision problem is in **NP** if and only if it can be defined in ESO.

Fagin (1974)

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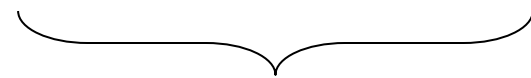
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“guess”

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Is there a logic for PTIME?

A logic for **P**TIME?

Fixed-point logic captures PTIME on ordered structures

FP is first-order logic with an **inflationary fixed-point** operator.

A property P of **ordered structures** can be *decided* in PTIME if and only if P can be *defined* by a sentence of FP.


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Ordered structure: Vocabulary contains a binary symbol “ \leq ” interpreted as a total ordering of the vertices.

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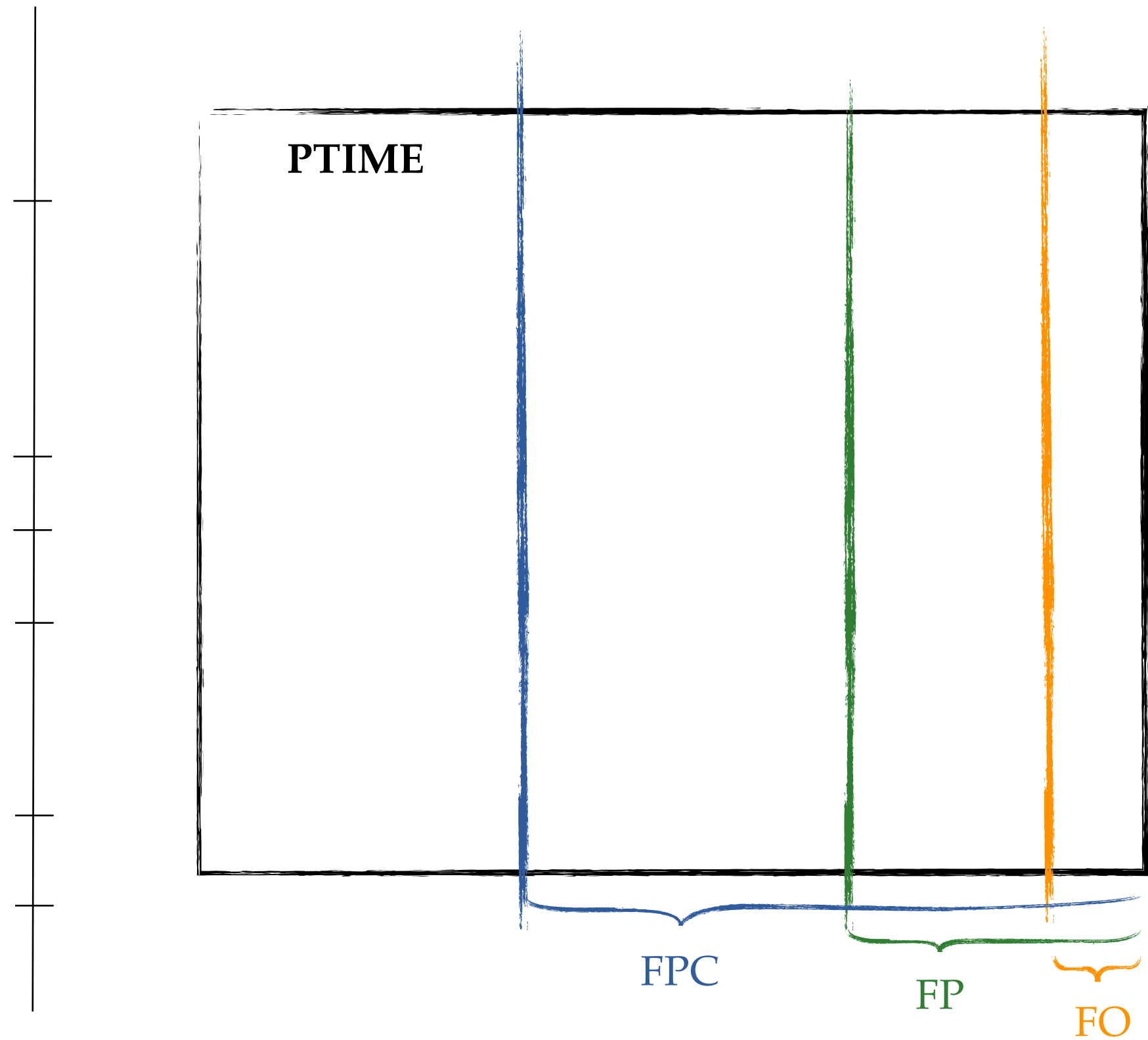
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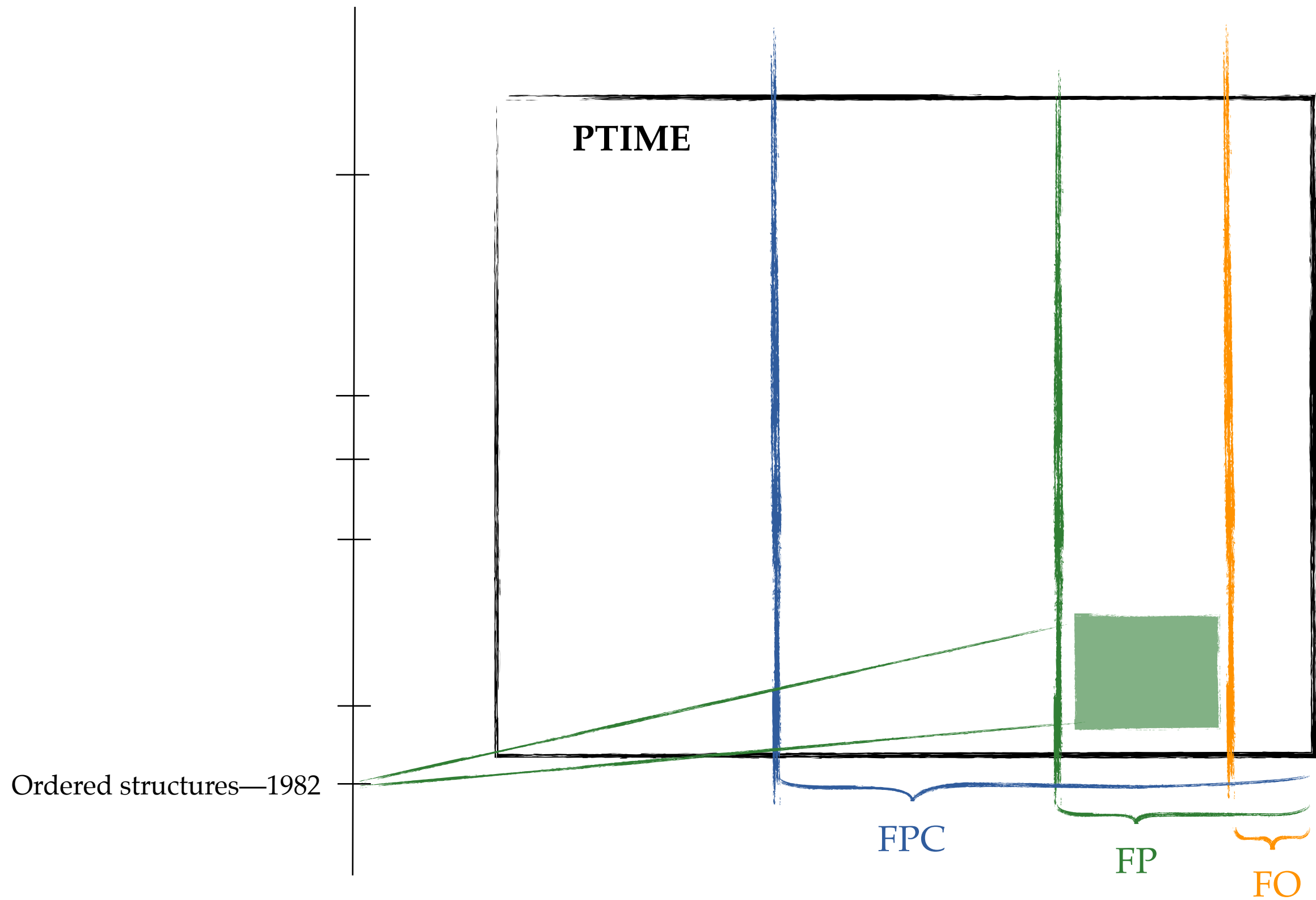
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- On unordered structures, FP cannot even express if a graph has an even or odd number of vertices.
- *Fixed-point logic with counting* (**FPC**) is FP together with terms that **count** the number of solutions to formulas.

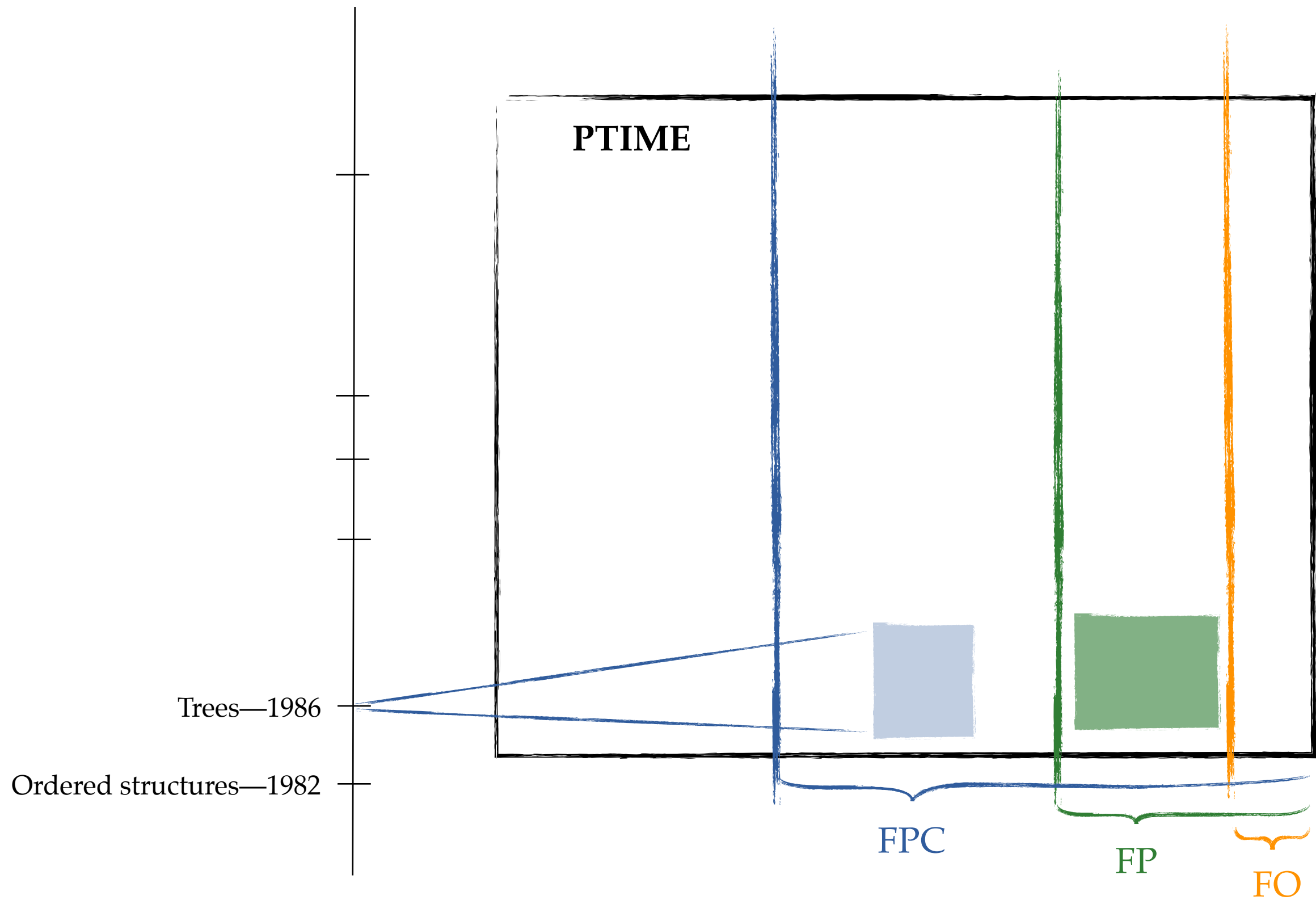
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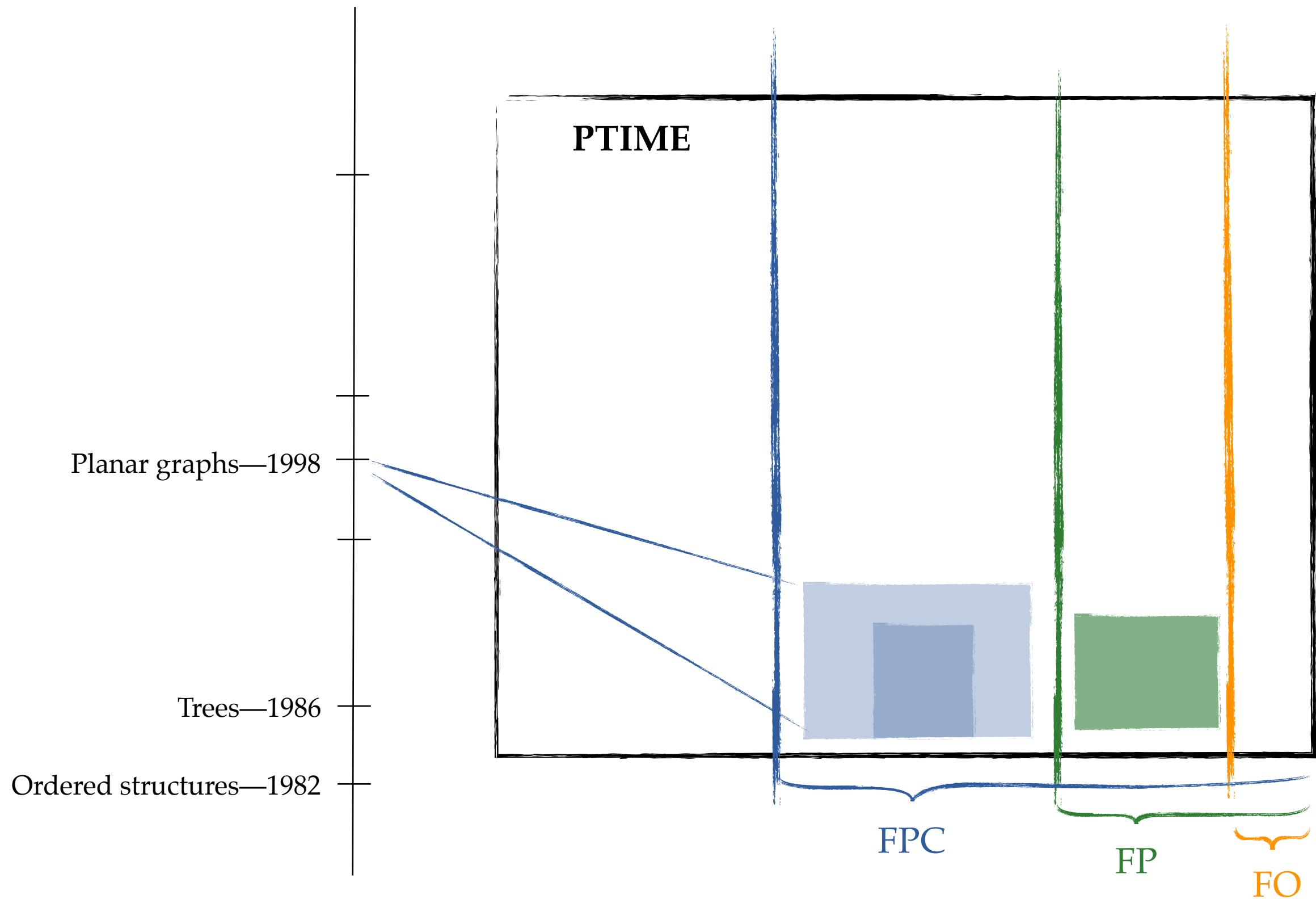
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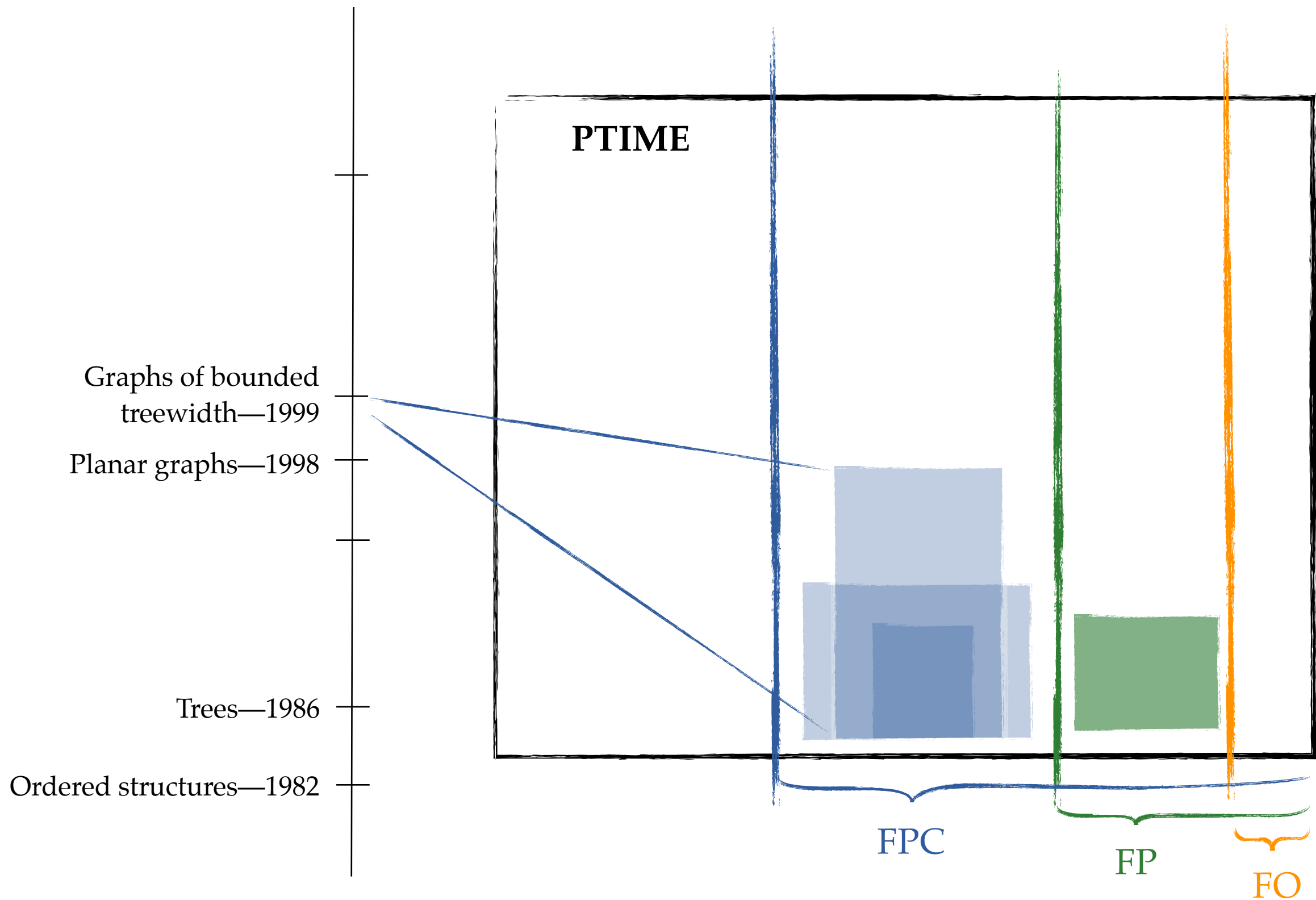
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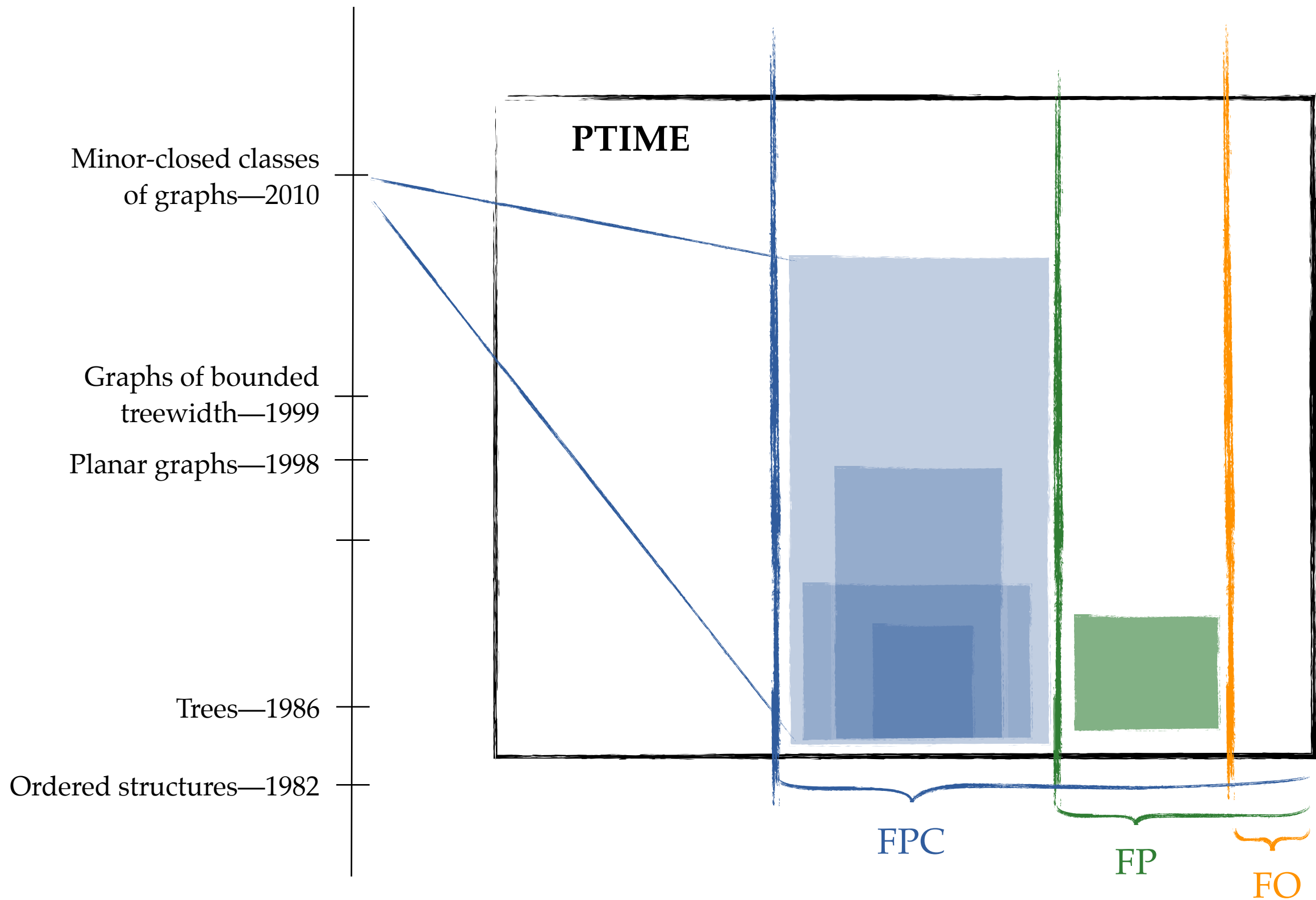
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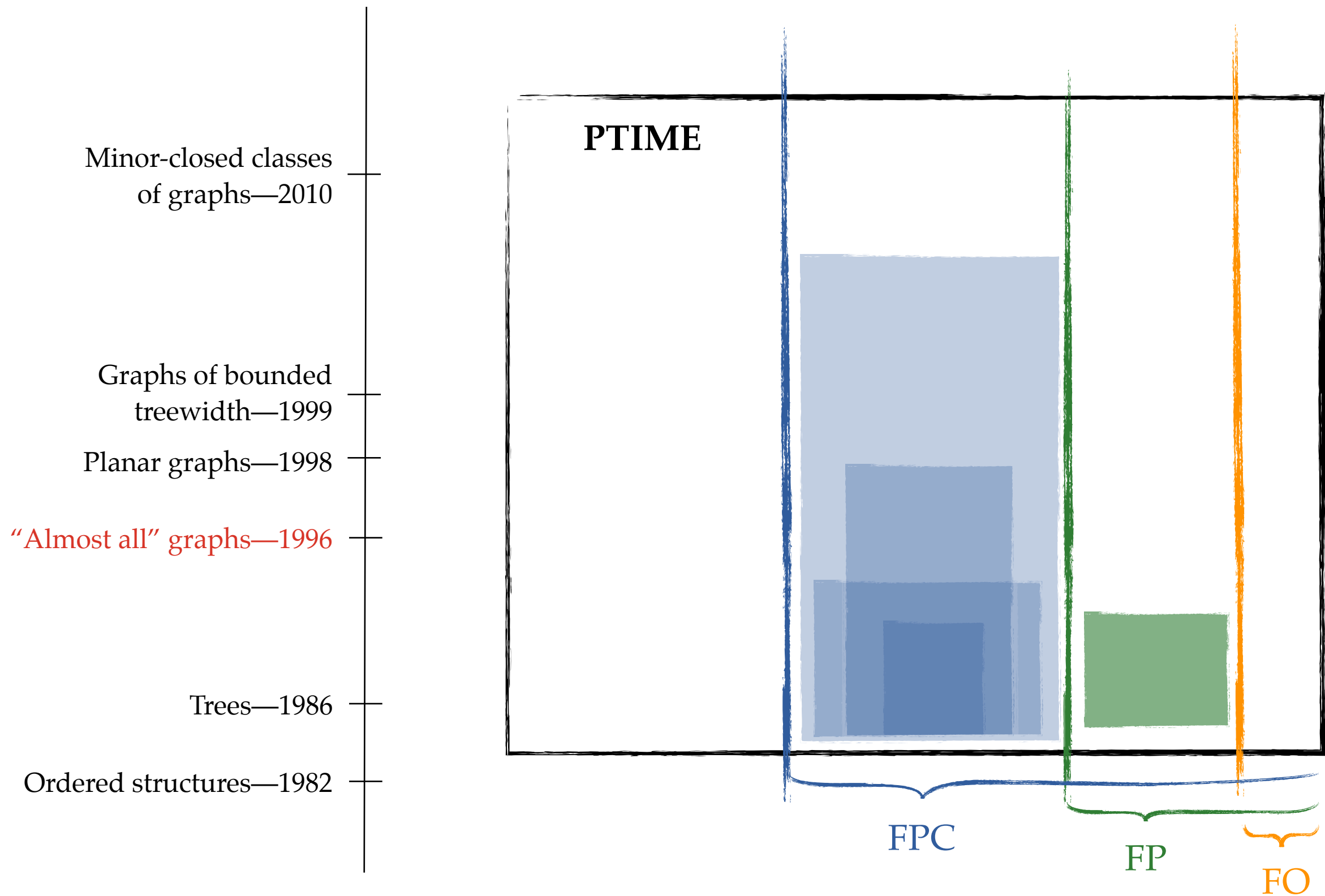
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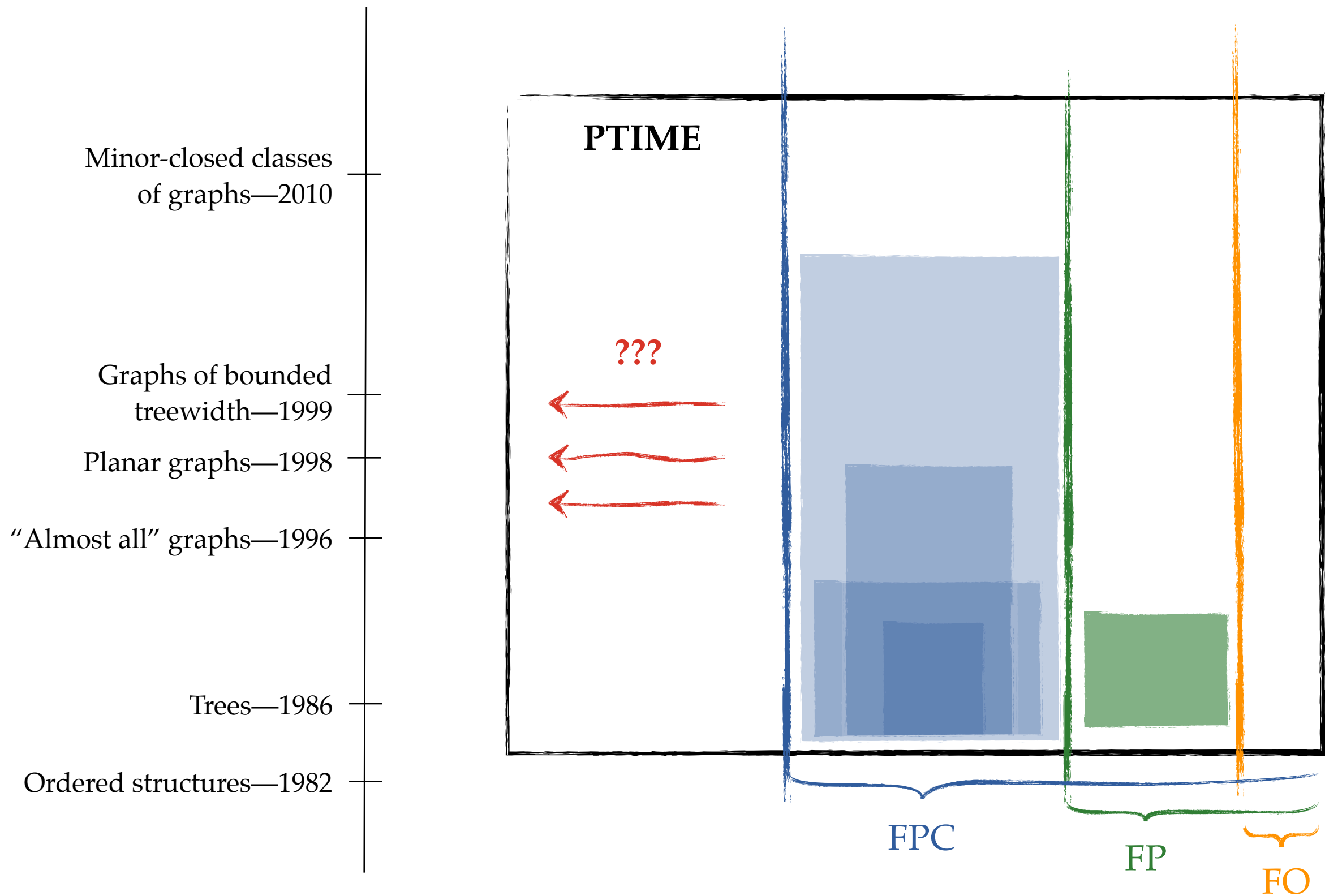
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FPC captures PTIME on... all graphs?



Proving non-definability in FPC

C^k — first-order logic with variables x_1, \dots, x_k and **counting quantifiers** of the form $\exists^{\geq i} x . \varphi$

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G and H agree on all sentences of C^k

iff

Duplicator has a winning strategy in the k -pebble bijection game on G and H

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Facts

- For each k , we can decide the winner of the k -pebble game in polynomial time.
- Close connection with a family of algorithms for graph isomorphism: **Weisfeiler-Lehman** method.

Non-definability result for FPC

There is a polynomial-time decidable property of finite graphs that is not definable in FPC.

Cai, Fürer and Immerman (1992)

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More recently: See which problems in **linear algebra** can be expressed in FPC

Descriptive complexity of problems in linear algebra

The usual notion of a matrix

$A = (a_{ij})$ — an m -by- n rectangular array of elements

| | | | | | | | | | | |
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Recall: Over ordered structures FP (and hence FPC) can define *all* polynomial-time properties.

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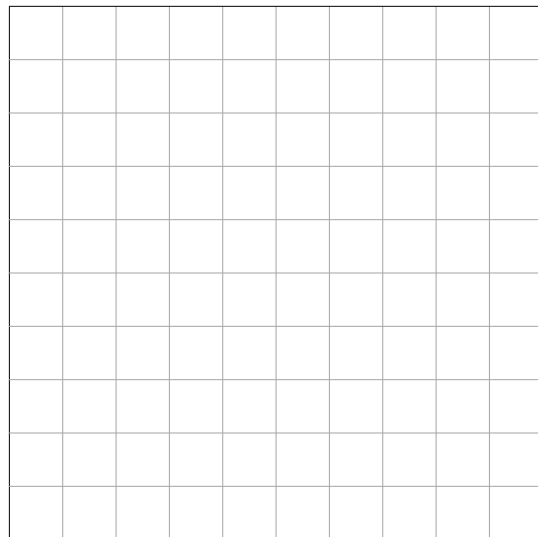
all PTIME matrix
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Many natural matrix properties **invariant under permutation** of rows and columns
(rank, determinant, etc.)

Unordered matrices

I, J — finite and non-empty sets

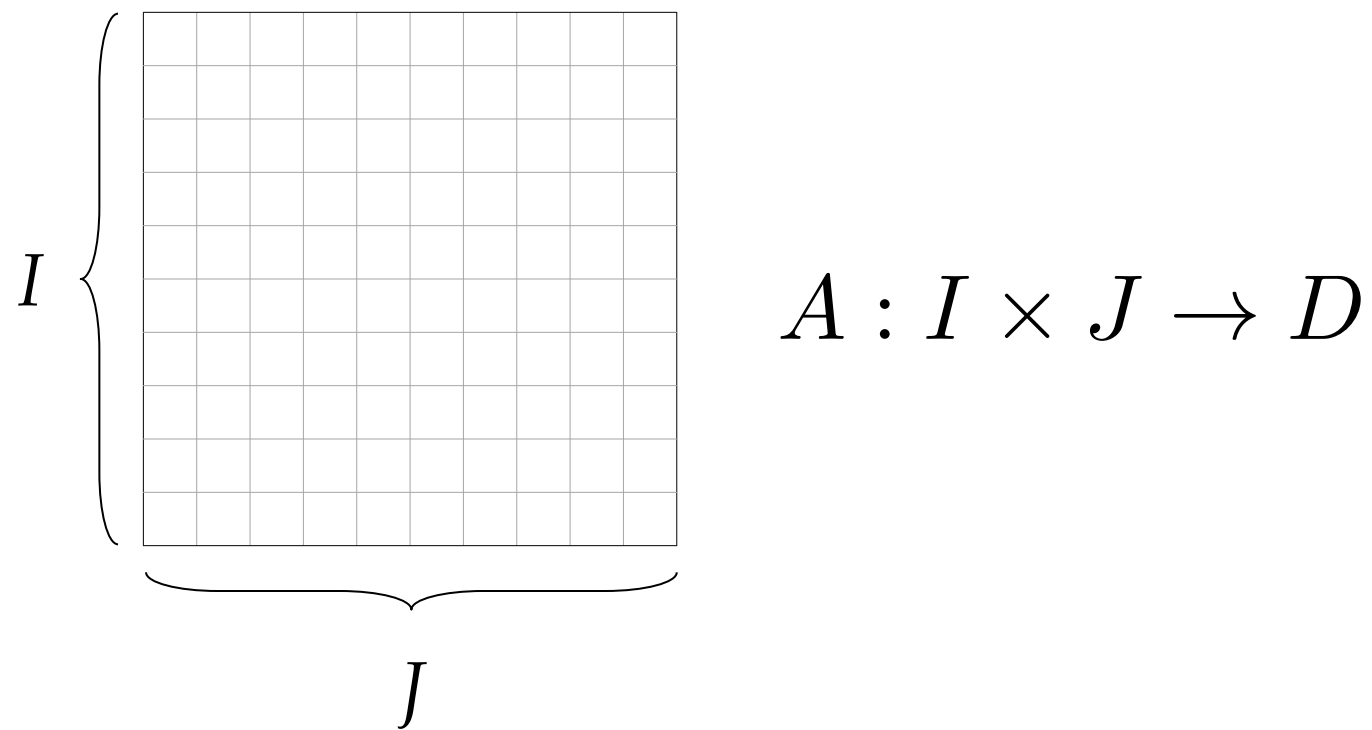
D — a group, a ring or a field



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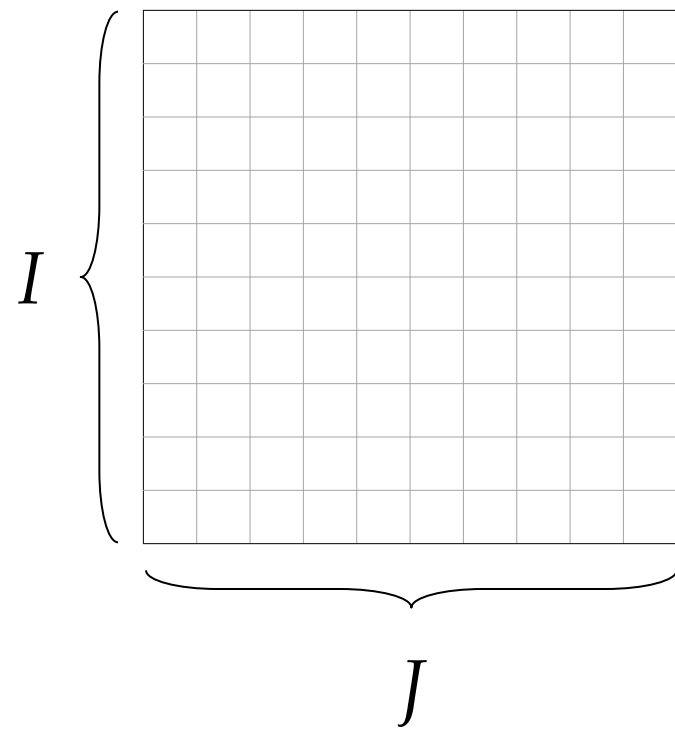
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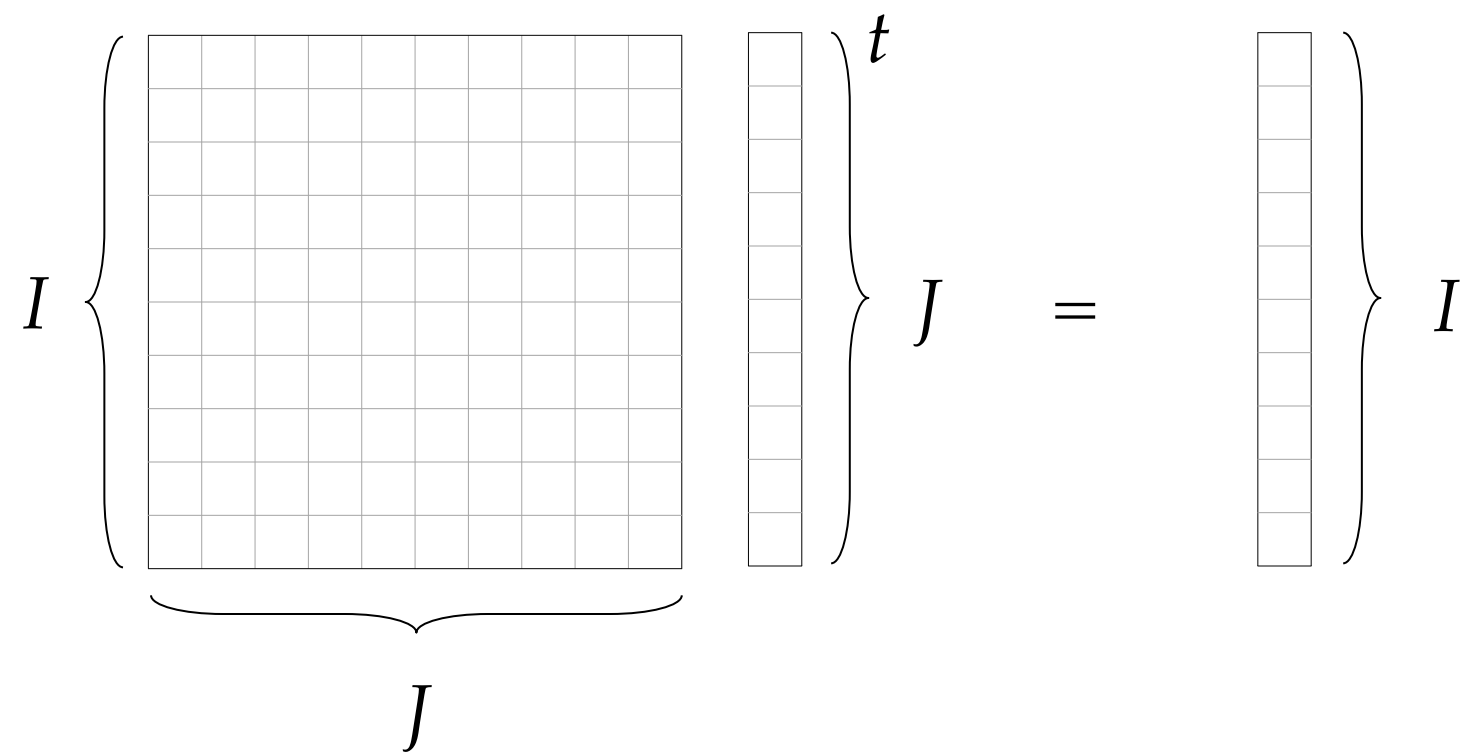
$$A : I \times J \rightarrow D$$

“an I -by- J matrix over D ”

Unordered systems of linear equations

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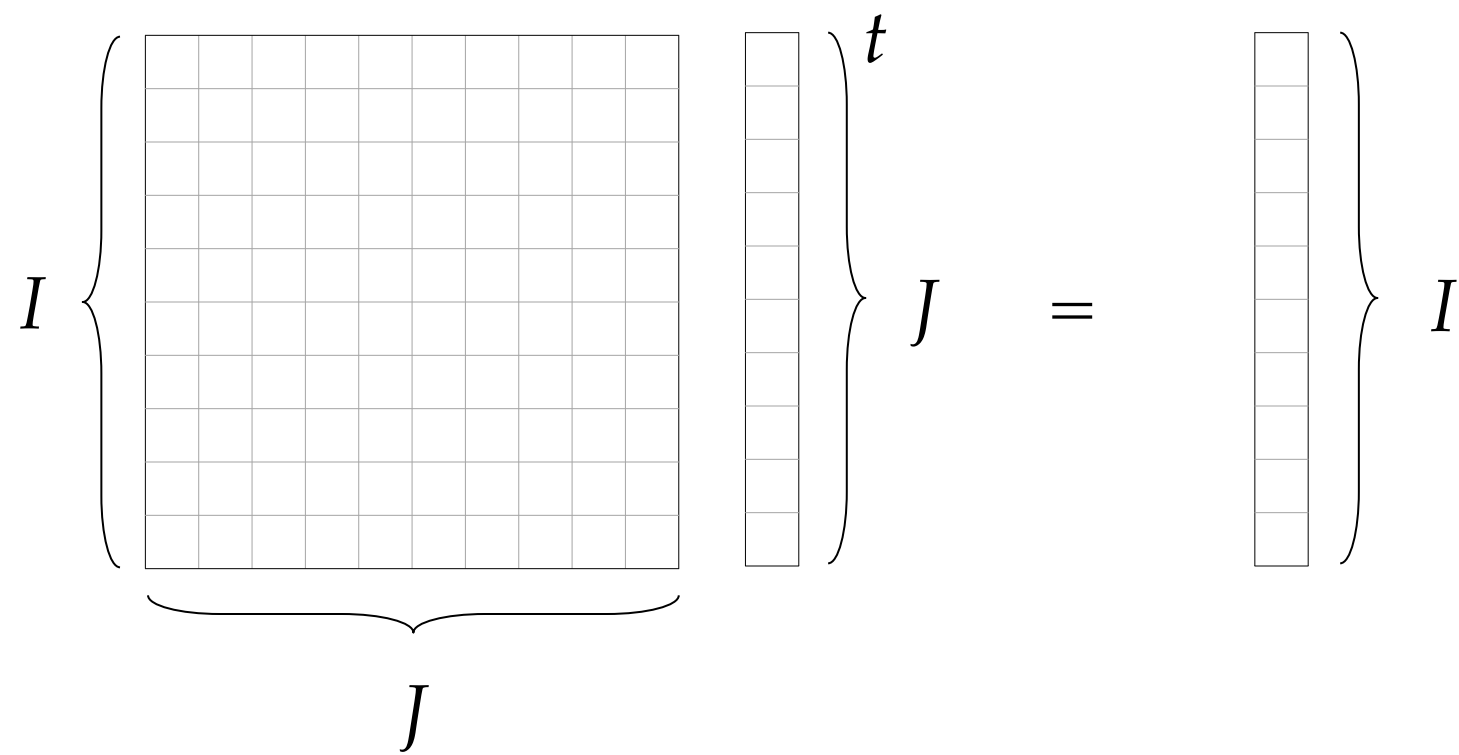
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The diagram illustrates a linear system $Ax = b$. On the left, a matrix A is represented by a grid of 10 rows and 10 columns. A vertical brace on the left side of the grid is labeled I , indicating the number of rows. A horizontal brace below the grid is labeled J , indicating the number of columns. To the right of the matrix is a vertical column of 10 cells representing the vector x . A vertical brace on the right side of this column is labeled t , indicating its length. A large vertical brace on the far right of this group is labeled J . An equals sign follows. To the right of the equals sign is another vertical column of 10 cells representing the vector b . A vertical brace on the right side of this column is labeled I .

$$Ax = b$$

Unordered systems of linear equations



$$A \mathbf{x} = \mathbf{b}$$

Unordered systems of linear equations

As a relational structure over a **fixed** domain D :

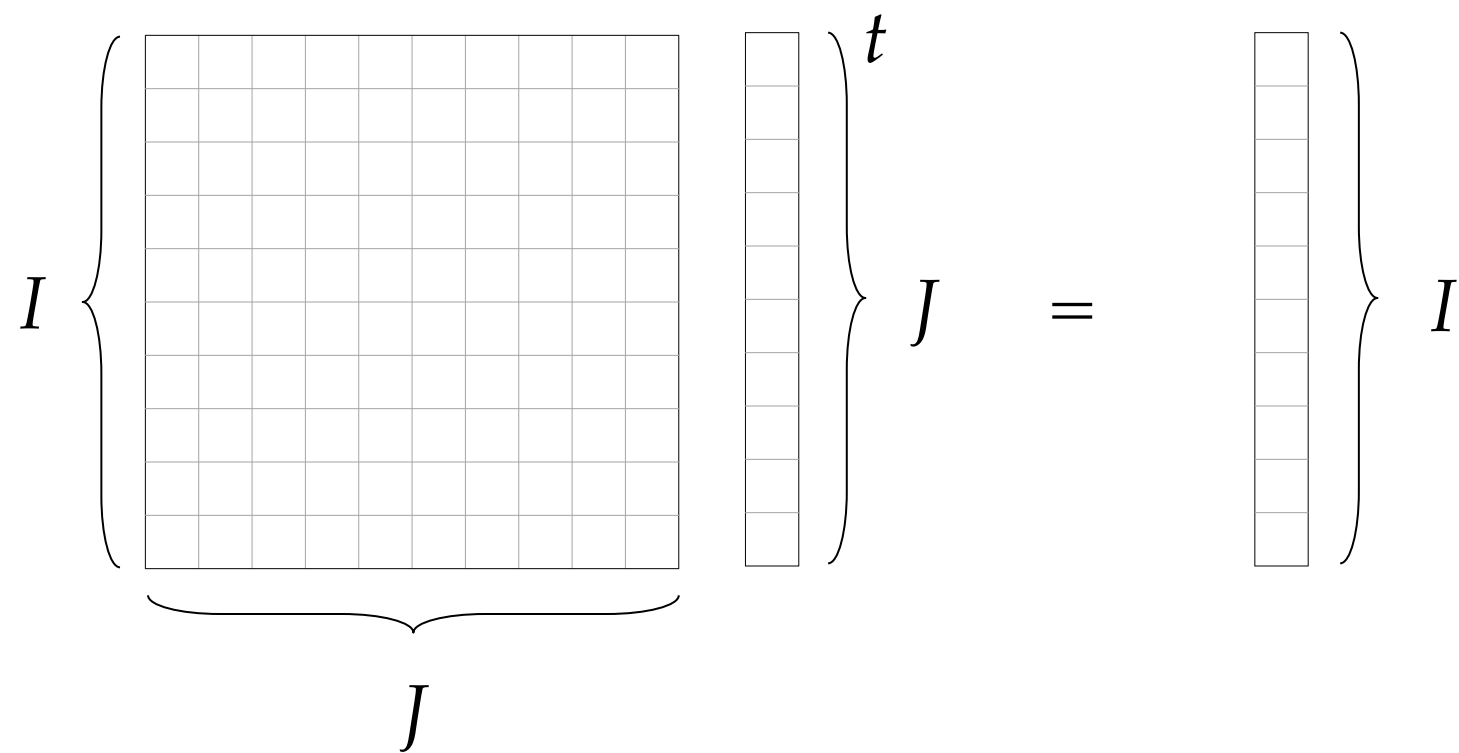
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$$Ax = b$$

Unordered systems of linear equations

As a relational structure over a **fixed** domain D :

$$\mathfrak{S} = (I, J; (A_d)_{d \in D}, (b_d)_{d \in D}) \quad \text{where} \quad A_d \subseteq I \times J \quad \text{and} \quad b_d \subseteq I$$



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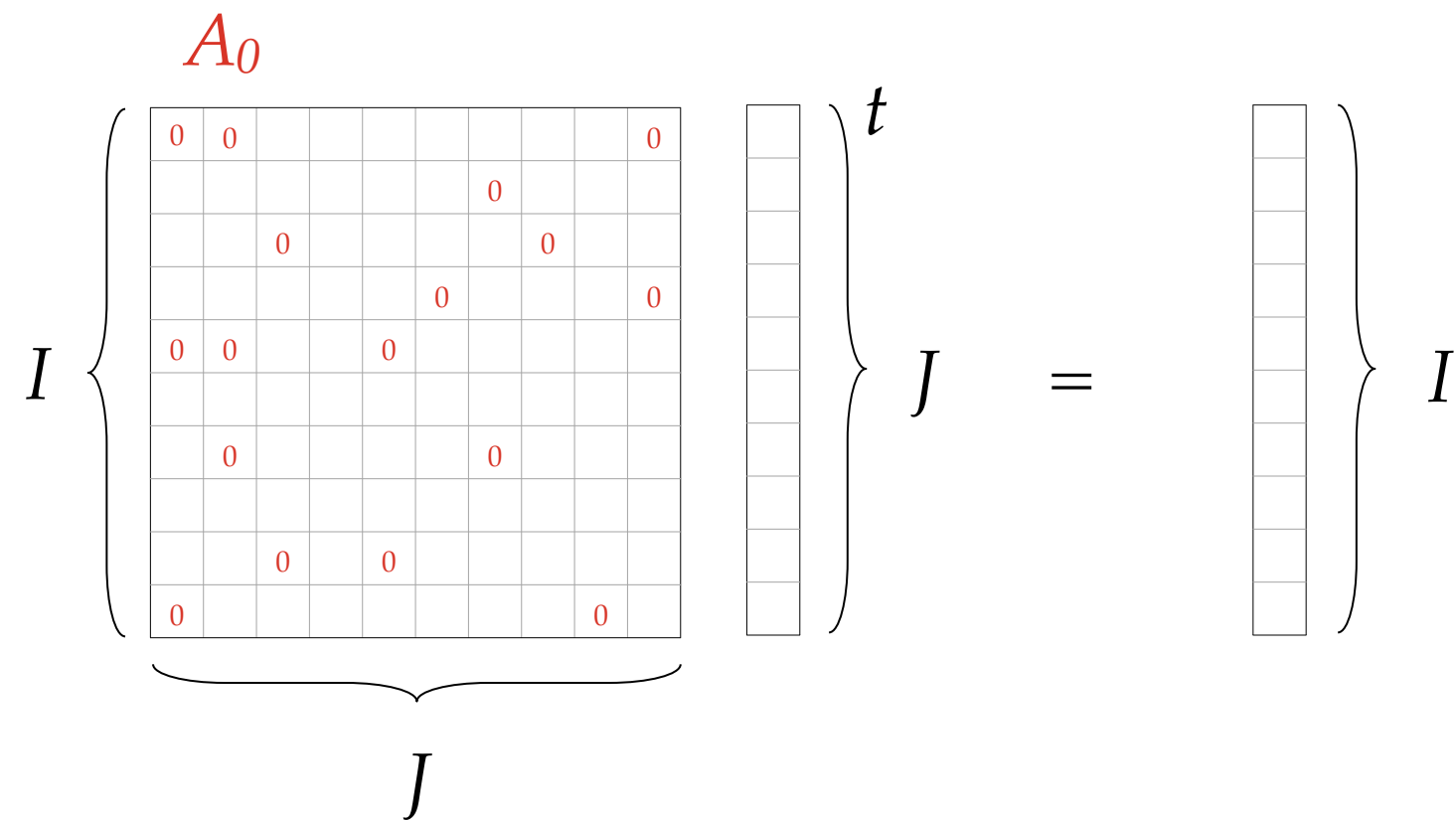
A_0

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A_1

| | | | | | | | | | |
|---|---|---|---|---|---|---|---|---|---|
| 0 | 0 | 1 | | 1 | | | | | 0 |
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J

$$A \mathbf{x} = \mathbf{b}$$

FPC — more non-definability results

Solvability of systems of **linear equations** over any fixed **finite Abelian group** is not definable in FPC.

Atserias, Bulatov and Dawar (2007)

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Matrix rank over finite fields is not definable in FPC.

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(Next talk: solvability problems over groups and rings)

Next step: extend fixed-point logic
with ability to define matrix rank

Definable matrix relations

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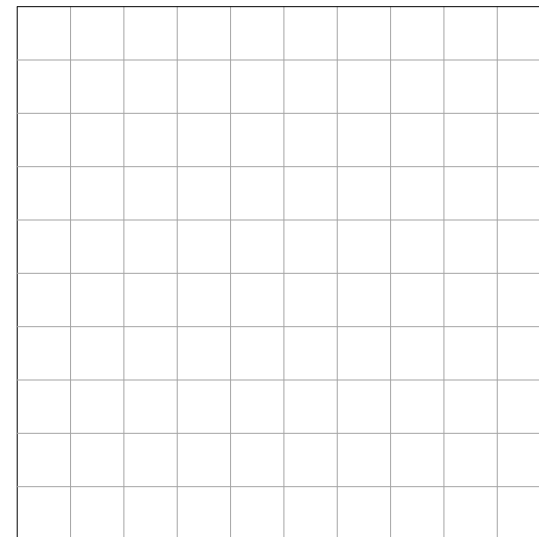
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$M_\varphi^G :$
(over $\text{GF}(2)$)

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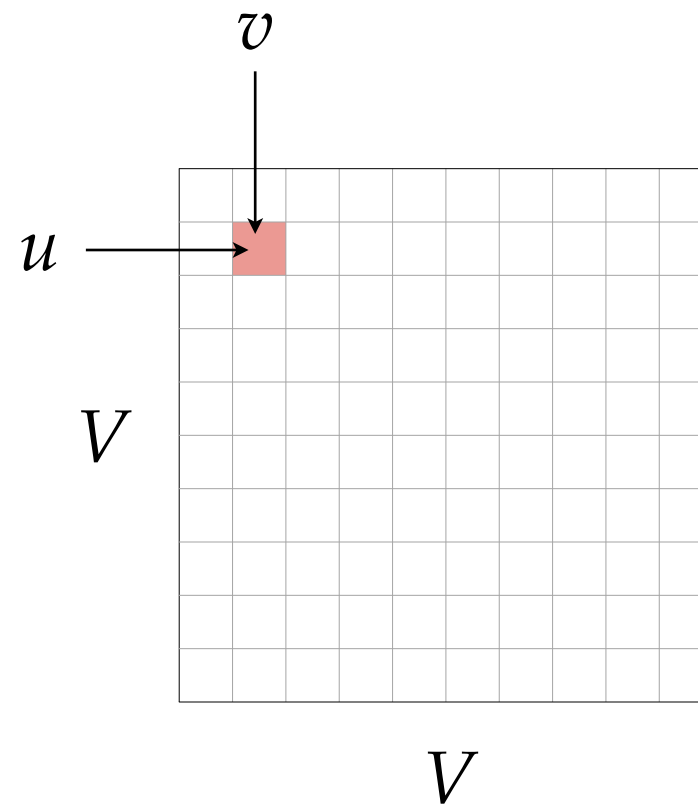
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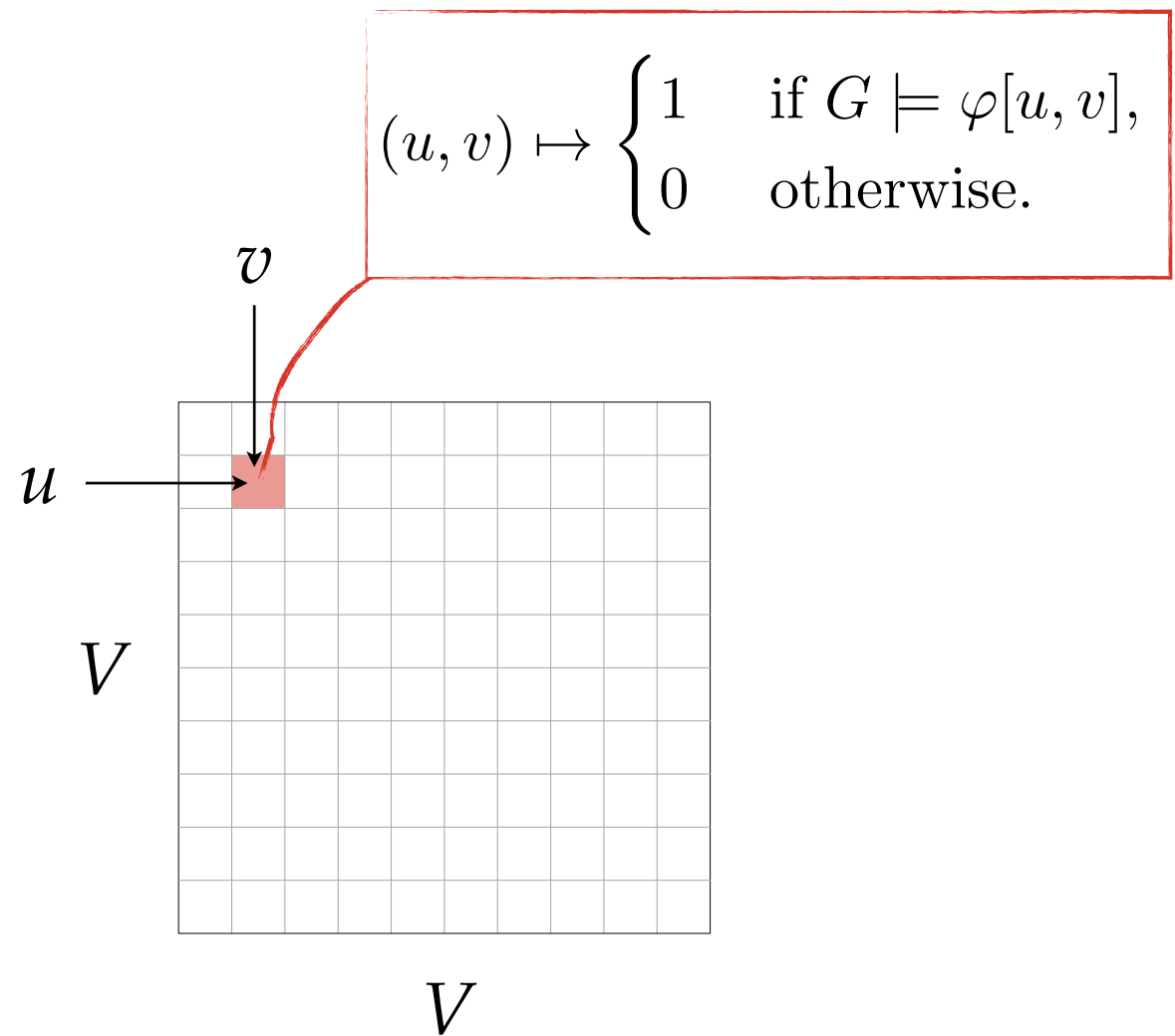
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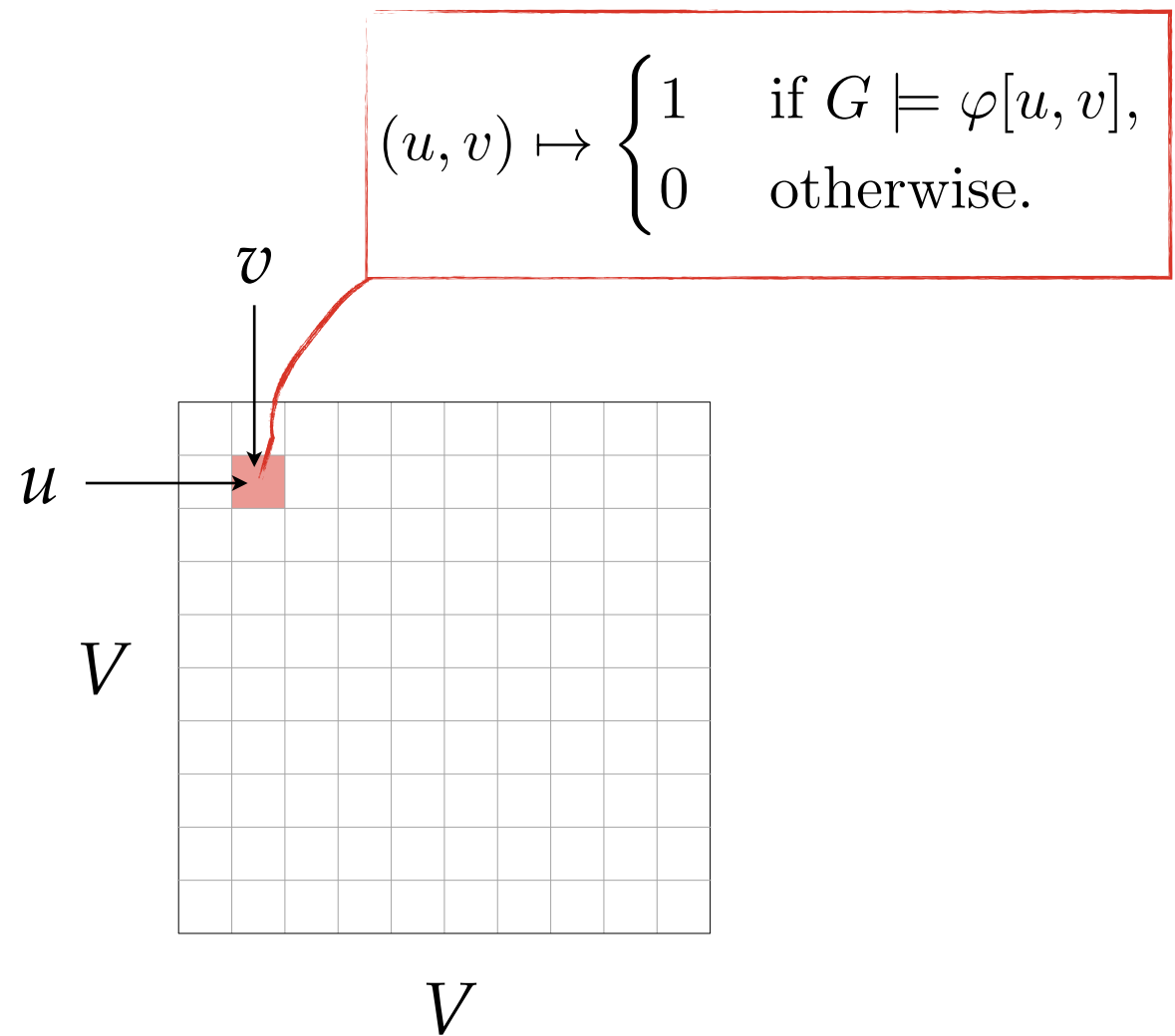


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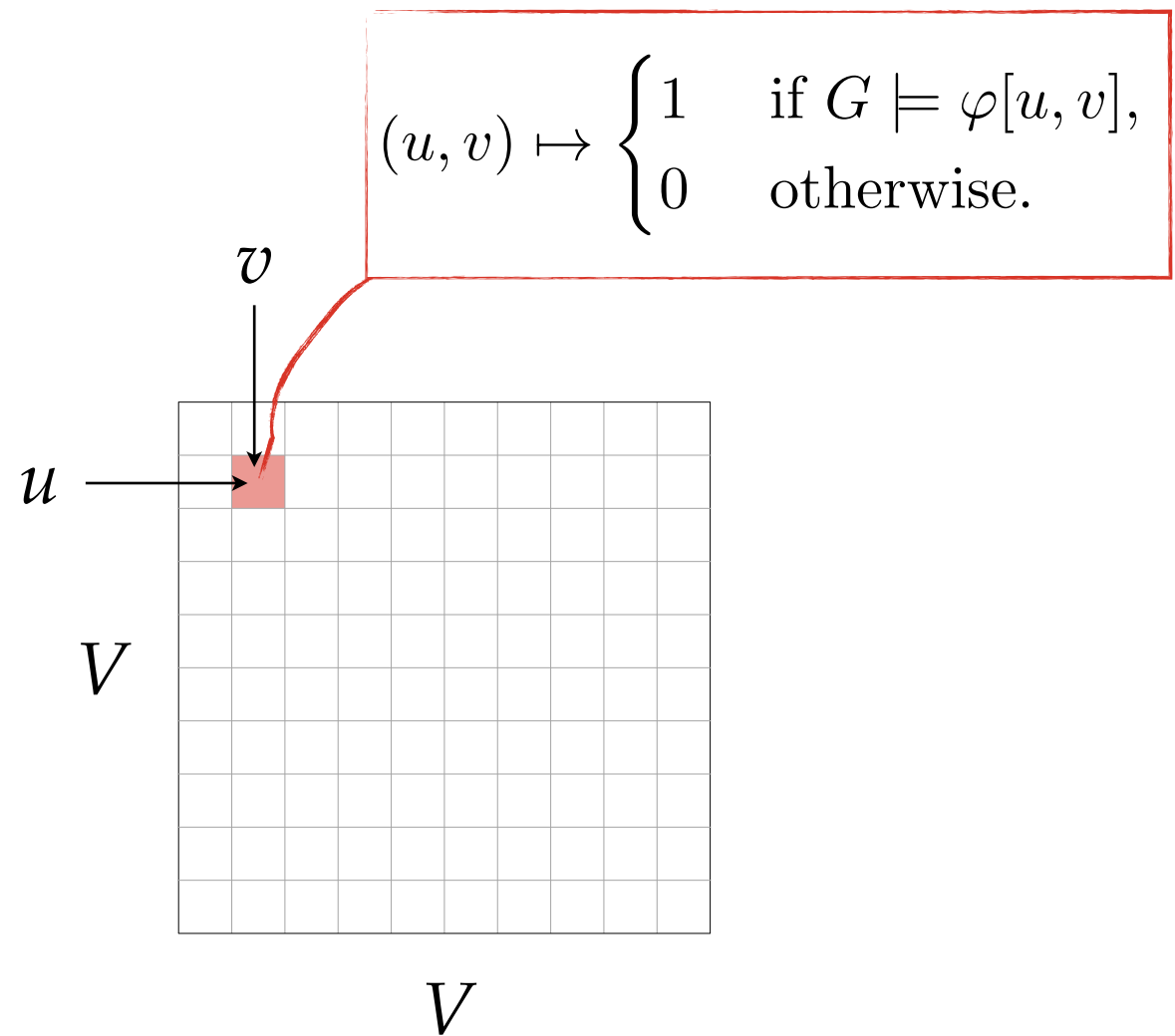
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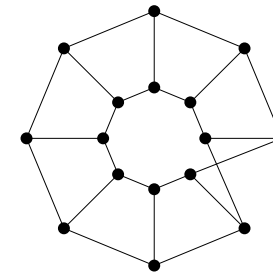
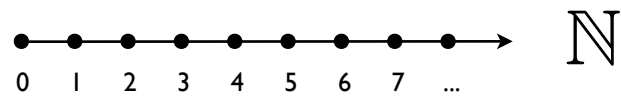


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More generally: formalise matrices over $\text{GF}(p)$, p prime

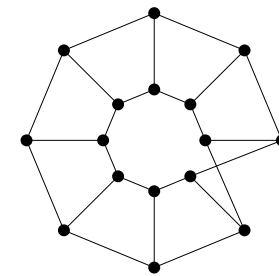
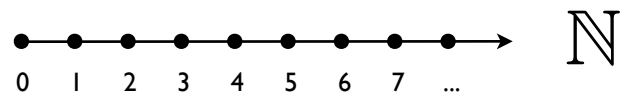
Fixed-point logic with rank operators

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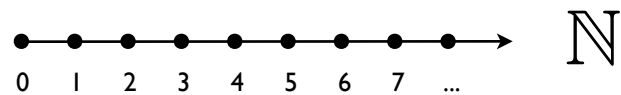


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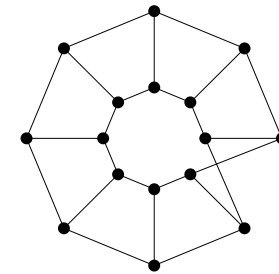
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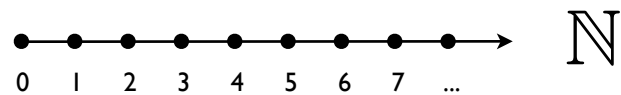


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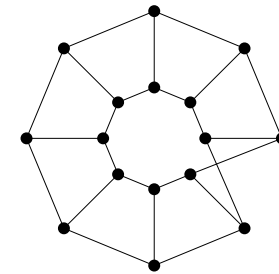
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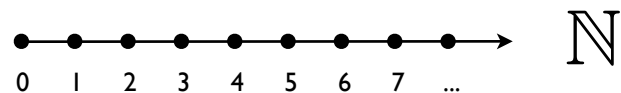


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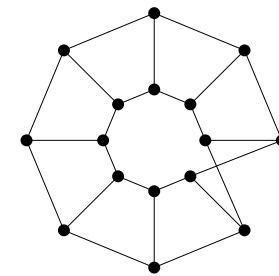
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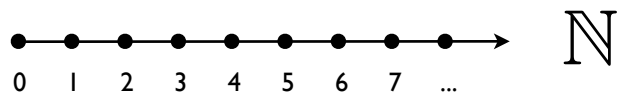
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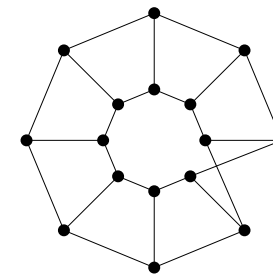
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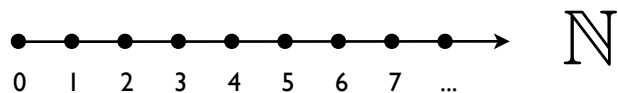
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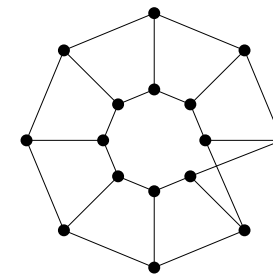
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→ Logics **FPR_p**, **FPR** and similarly **FOR_p**, **FOR**

Expressive power of rank logics

For any prime p , FPR_p can express solvability of linear equations over $\text{GF}(p)$.

Dawar, Grohe, H., Laubner (2009)

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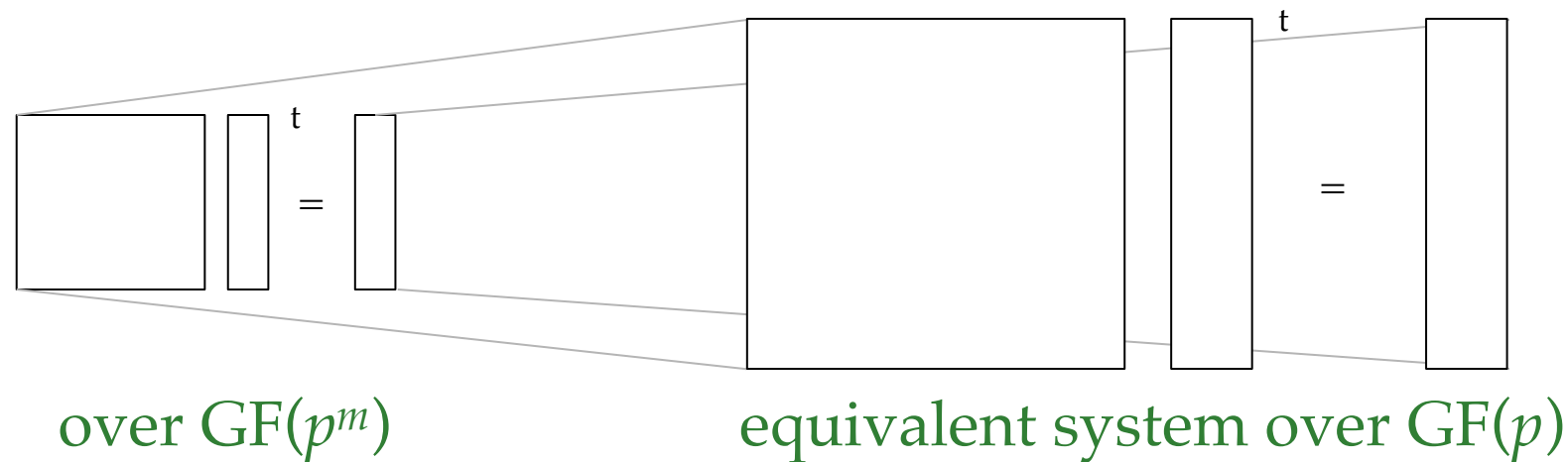
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Represent each element of $\text{GF}(p^m)$ as an m -by- m matrix over $\text{GF}(p)$

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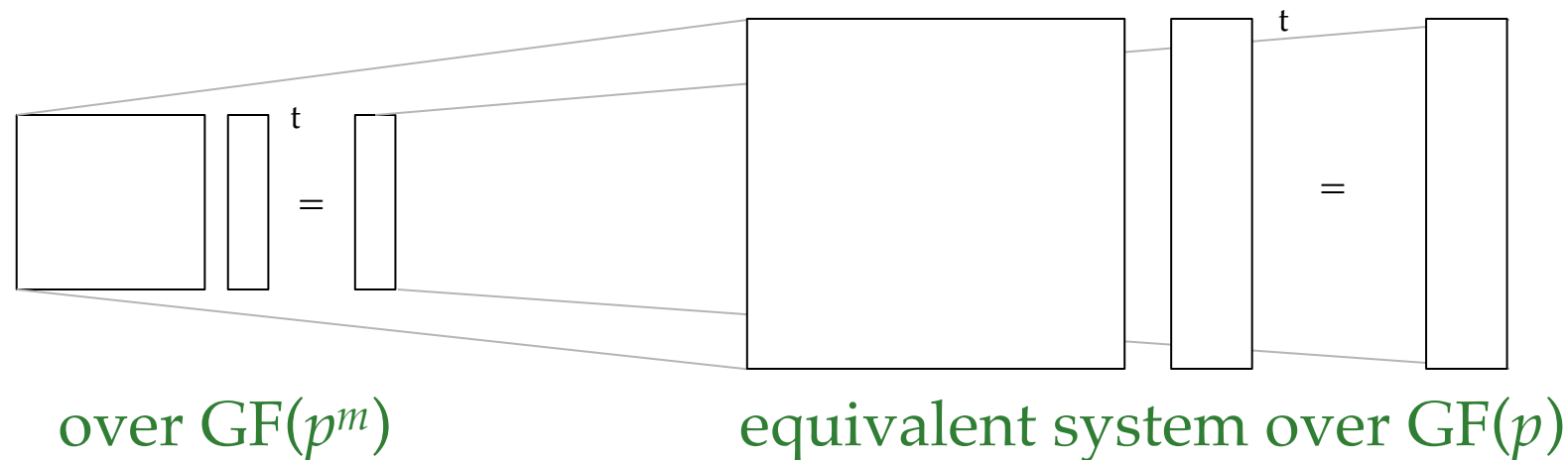


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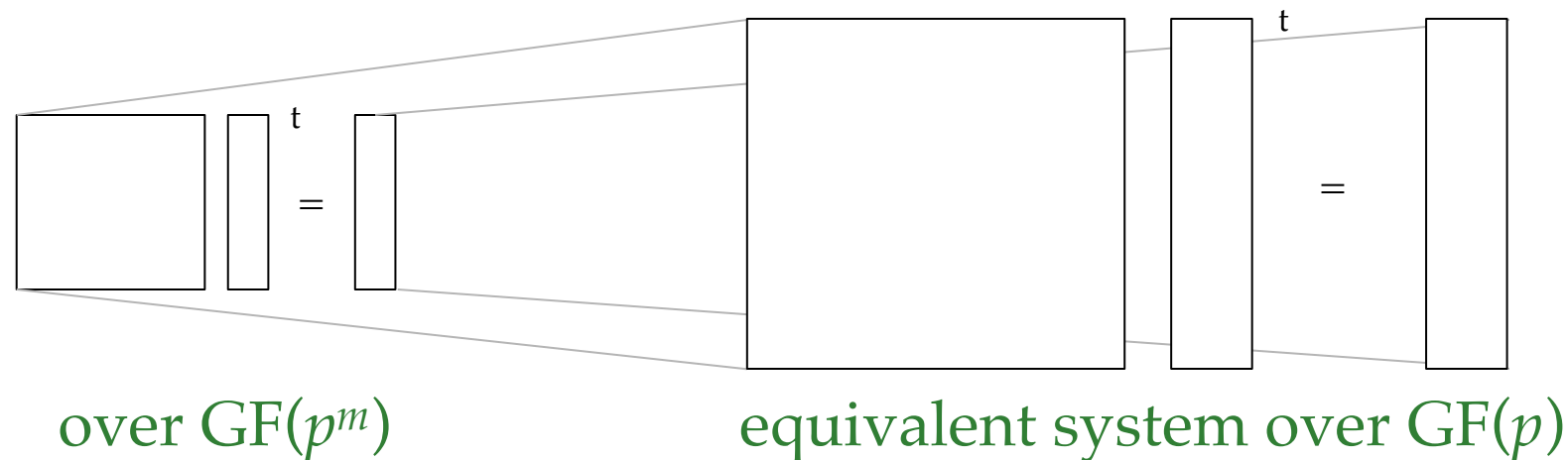
Corollary

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(we can simulate counting by expressing rank of diagonal matrices)

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Isomorphism of graphs of **colour class size 4** can be expressed in FOR_2 .

Dawar, H. (2011)

Pebble games for rank logics & the Weisfeiler-Lehman method

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G and H agree on all sentences of k -variable rank logic over $\text{GF}(p)$

iff

Duplicator has a winning strategy in the k -pebble matrix-rank game on G and H

Matrix-rank game over $\text{GF}(p)$

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Strengthening the game rules

Two tuples (A_1, A_2, \dots, A_m) and (B_1, B_2, \dots, B_m) of n -by- n matrices over a field k are **simultaneously similar** if there is an invertible S such that $S A_i S^{-1} = B_i$ for all i .

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There is a deterministic algorithm that, given two m -tuples \mathbf{A} and \mathbf{B} of n -by- n matrices over a finite field $\text{GF}(q)$, determines in time $\text{poly}(n, m, q)$ whether \mathbf{A} and \mathbf{B} are simultaneously similar.

Chistov, Karpinsky and Ivanyov (1997)

Game based on invertible linear maps

Invertible-map game on G and H over $\text{GF}(p)$:

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- Refines R_p^k -equivalence: If Duplicator wins the k -pebble invertible-map game on G and H then she also wins the k -pebble matrix rank game on G and H .

Connection with stable colouring

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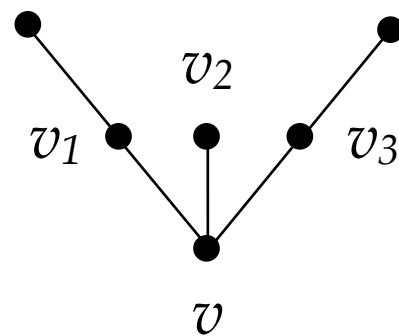
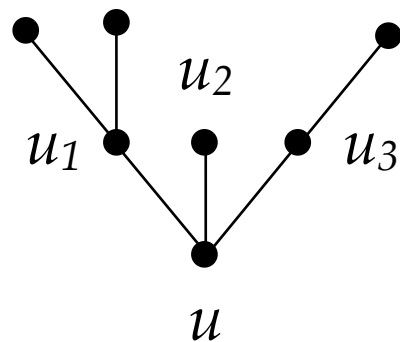
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Weisfeiler-Lehman refinement

Input: Graph $G = (V, E)$

Output: Equivalence relation \approx on V .

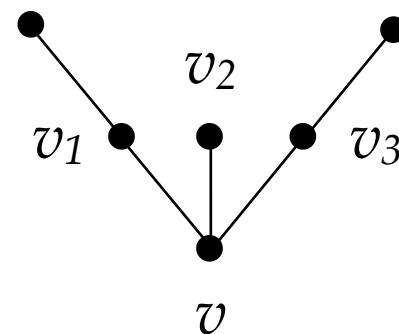
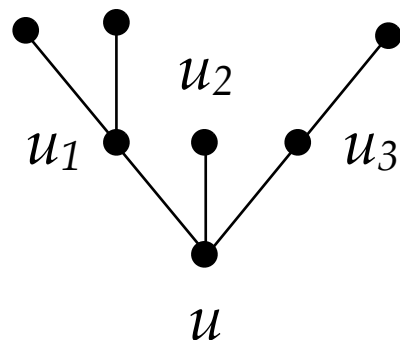


Weisfeiler-Lehman refinement

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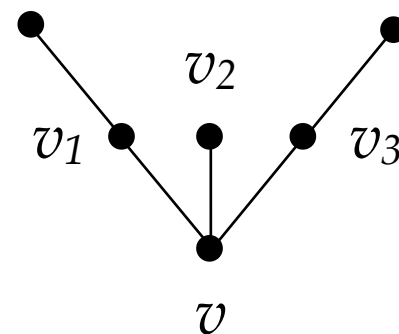
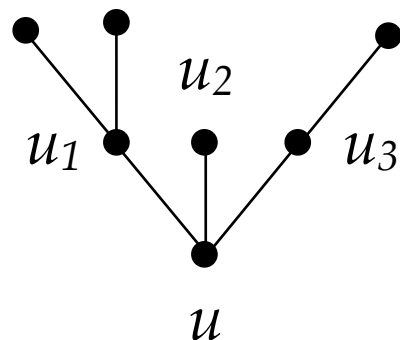
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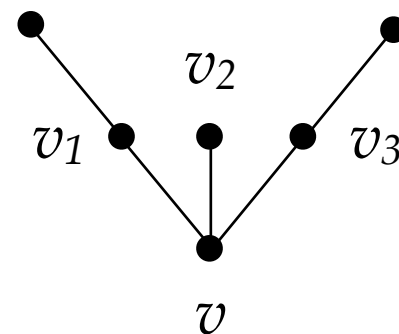
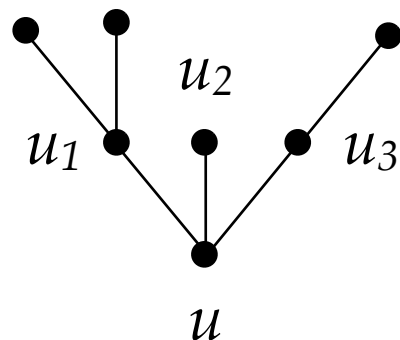
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Initial: $u \sim_0 v$ iff $\deg(u) = \deg(v)$



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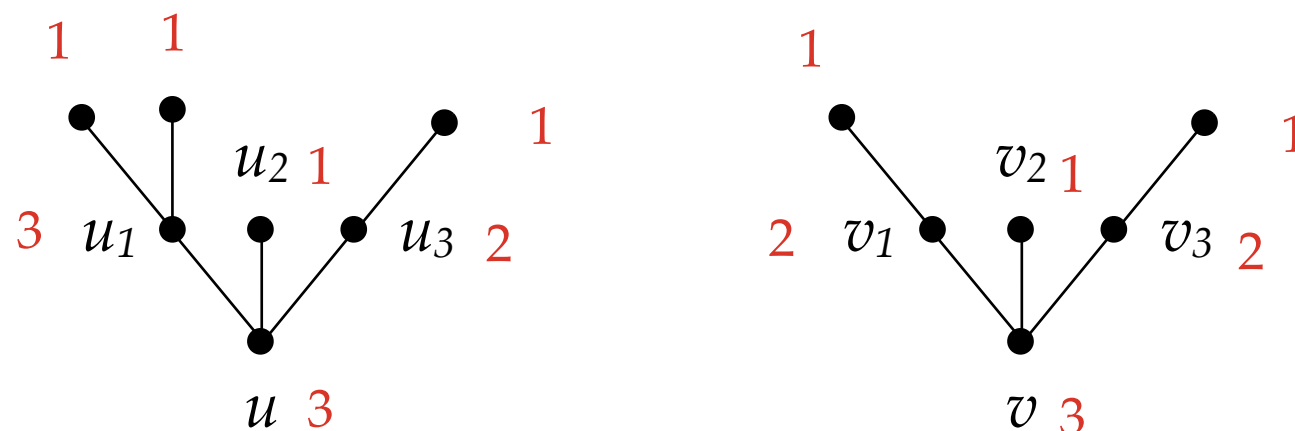
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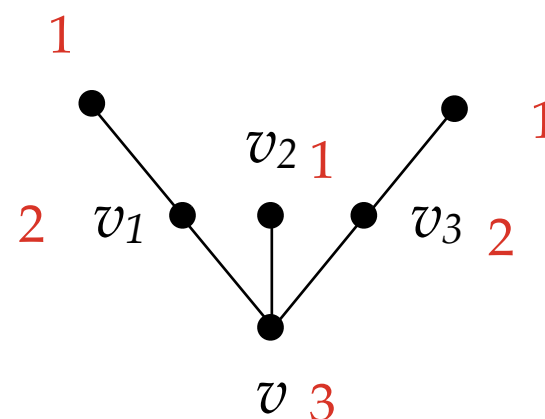
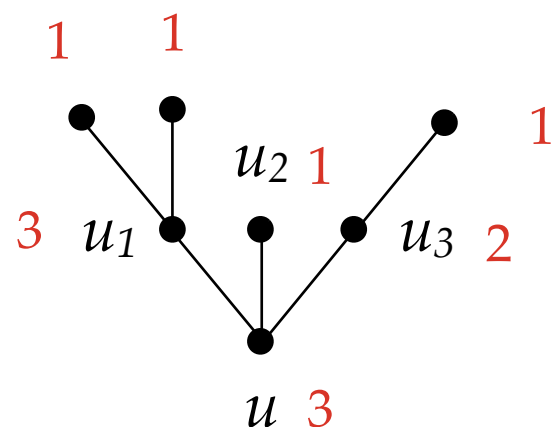
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Inductively define: $\sim_0 \supseteq \sim_1 \supseteq \dots \supseteq \sim_m = \sim_{m+1} =: \underline{\underline{\approx}}$

Initial: $u \sim_0 v$ iff $\deg(u) = \deg(v)$

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Weisfeiler-Lehman refinement

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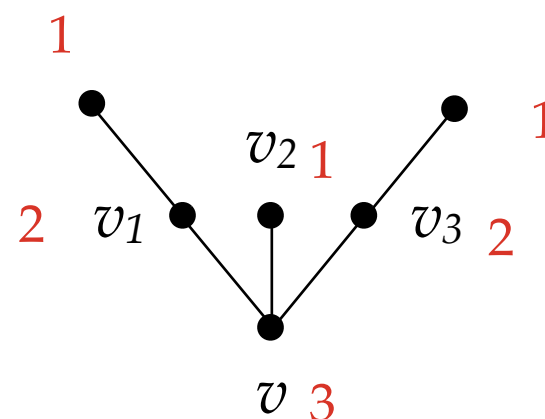
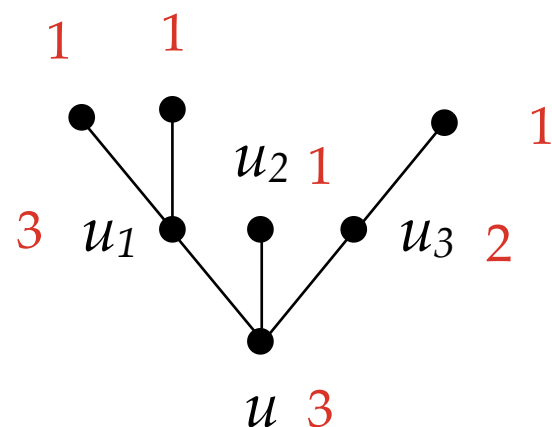
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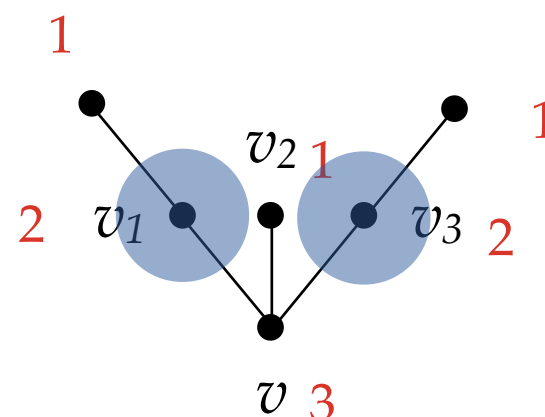
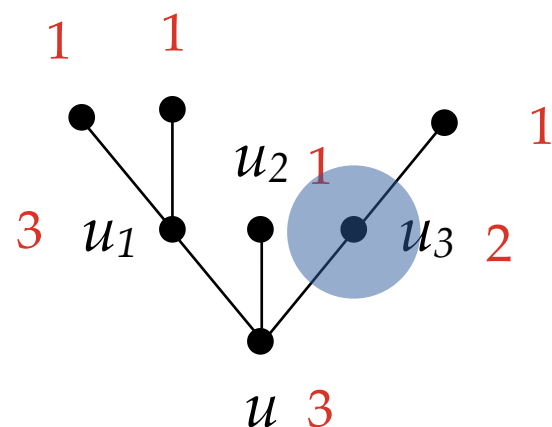
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Input: Graphs $G = (V_G, E_G)$ and $H = (V_H, E_H)$

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k -dimensional WL^* refinement

One-element extensions in $G = (V, E)$

For $\alpha \subseteq V^k$, a k -tuple $\vec{u} \in V^k$ and $0 \leq i < k$, let:

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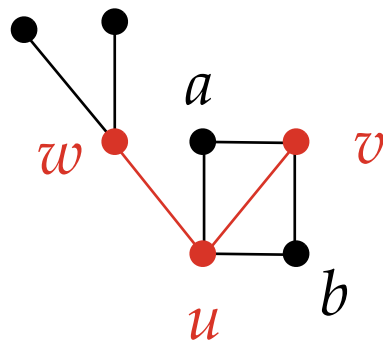
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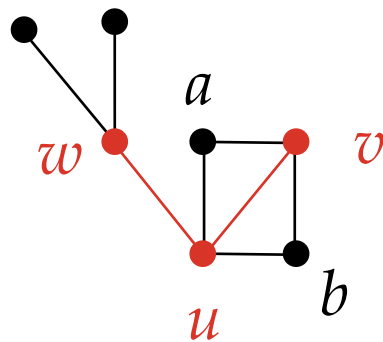
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$$\Gamma_0(uvw, \alpha) = \{a, b\}$$

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Theorem: $\vec{u} \approx \vec{v}$ iff they agree on all C^k -formulas in G .

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As before: compute k -dimensional WL^* refinement and compare across the two graphs.

PTIME for fixed k : k -dim WL^* runs in time $O(n^{k+1} \log(n))$.

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There exists a sequence of pairs $\{(G_n, H_n)\}_n$ of non-isomorphic graphs for which it holds that:

- G_n and H_n have $O(n)$ vertices but
- G_n and H_n are not distinguished by the n -dim WL^* algorithm.

Cai, Fürer and Immerman (1992)

Refinement by invertible linear maps

Two-element extensions in $G = (V, E)$

For $\alpha \subseteq V^k$, a k -tuple $\vec{u} \in V^k$ and $0 \leq i \neq j < k$, let:

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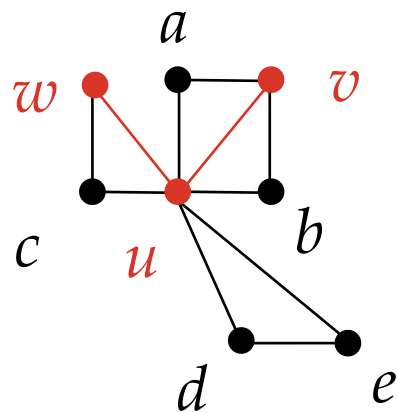
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there is $S \in \text{GL}_V(\text{GF}(p))$ s.t.

$$S \cdot \Gamma_{ij}(\vec{u}, \alpha) \cdot S^{-1} = \Gamma_{ij}(\vec{v}, \alpha)$$

for all $\alpha \in V^k / \sim_m$

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Similar to WL: compute k -dimensional IM refinement and compare across the two graphs (here over $GF(p)$)

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For each k and prime p , there is a pair of non-isomorphic graphs that can be distinguished by 3-dim IM_p but not by k -dim WL^* .

Dawar and H. (2012)

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For each k and distinct primes p and q , there is a pair of non-isomorphic graphs that can be distinguished by 3-dim IM_p but not by k -dim IM_q .

H. (2010)

k -dimensional IM_p more generally

Consider the invertible-map algorithm for larger matrices (**higher arity**) and finite **sets** of primes.

Can we give instances where the general algorithm fails to express graph isomorphism?

Some open problems

Problem 1: Separate FOR_p and FOR_q over empty signatures

For formula $\varphi(x, y)$, integer n and prime p , let $r_\varphi^p(n)$ denote the $\text{GF}(p)$ -rank of the matrix defined by $\varphi(x, y)$ over an n -element set.

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Polynomial-rank conjecture

For each $\varphi(x, y)$ and each prime p , there are unary polynomials f_0, \dots, f_{p-1} such that $r_\varphi^p(n) = f_i(n)$ for all (sufficiently large) n congruent to i modulo p .

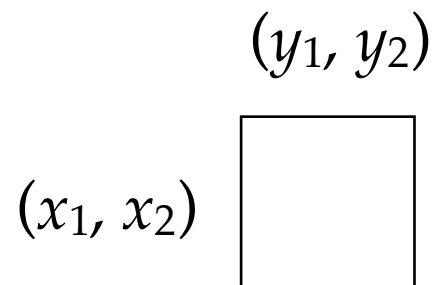
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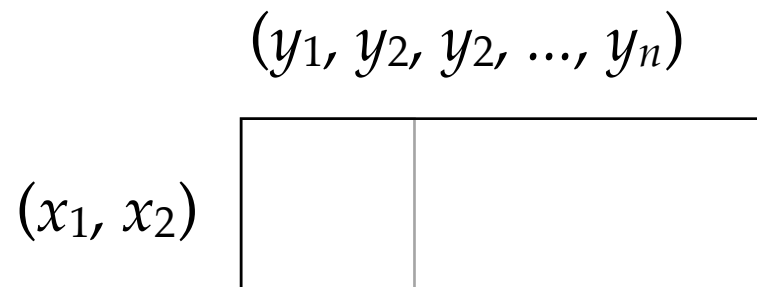
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???

(x_1, x_2, \dots, x_n)

$(y_1, y_2, y_2, \dots, y_n)$

| | |
|--|--|
| | |
| | |

H. and Laubner (2010)

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Problem 2: Give capturing results for FPR on natural classes of graphs

Consider classes on which we know that FPC does *not* capture PTIME:

- graphs of bounded degree
- graphs of bounded colour-class size

Further questions

- Can FPR express matching in arbitrary graphs?
- Does the “simultaneous similarity game” correspond to a natural logic?

More open problems to come in the next talk!