

# Constraint Satisfaction Problem: what makes the problem easy

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International Congress of Mathematicians



**CoCoSym: Symmetry in Computational Complexity**

This project has received funding from the European Research Council (ERC) under the European Union's Horizon 2020 research and innovation programme (grant agreement No 771005)

## Example

Check whether there exists a solution  $x_1, x_2, x_3, \dots \in \{0, 1\}$ .

$$\begin{cases} x_1 + x_2 + x_3 = 0 \pmod{2} \\ x_1 + x_3 + x_5 = 0 \pmod{2} \\ x_2 + x_4 + x_5 = 0 \pmod{2} \\ x_2 + x_3 + x_5 = 1 \pmod{2} \end{cases}$$

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What is the complexity of this problem? **Nobody knows!**



P

P

NP

P

CSP

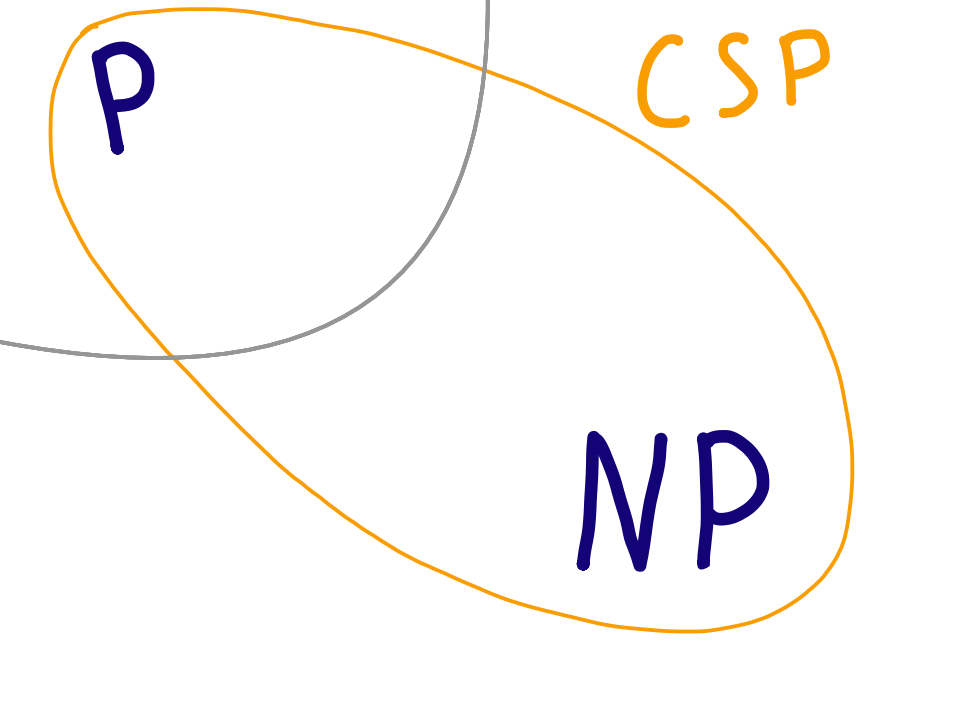
NP



P

CSP

NP



What is CSP?

## What is CSP?

### Constraint Satisfaction Problem

is a triple  $\langle \mathbf{X}, \mathbf{D}, \mathbf{C} \rangle$ , where

- ▶  $\mathbf{X} = \{x_1, \dots, x_n\}$  is a set of variables,
- ▶  $\mathbf{D} = \{D_1, \dots, D_n\}$  is a set of the respective domains of values, and
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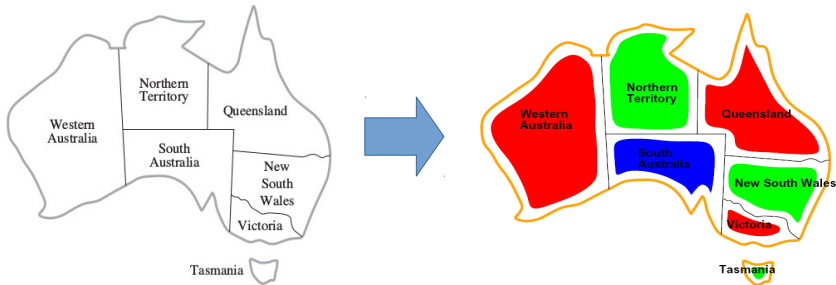
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Almost everything  
is CSP!!!



# CSP example: map coloring



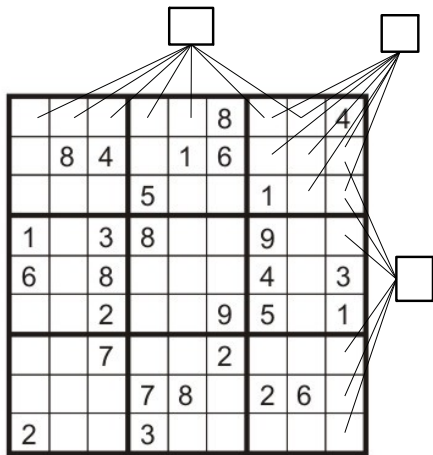
Problem: assign each territory a color such that no two adjacent territories have the same color

Variables:  $X = \{WA, NT, Q, NSW, V, SA, T\}$

Domain of variables:  $D = \{r, g, b\}$

Constraints:  $C = \{SA \neq WA, SA \neq NT, SA \neq Q, \dots\}$

## Another example: sudoku



- Variables:
  - Each (open) square
- Domains:
  - $\{1,2,\dots,9\}$
- Constraints:

9-way alldiff for each column

9-way alldiff for each row

9-way alldiff for each region

(or can have a bunch of pairwise inequality constraints)

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### CSP( $\Gamma$ )

Given: a conjunction of relations, i.e. a formula

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where  $R_1, \dots, R_s \in \Gamma$ .

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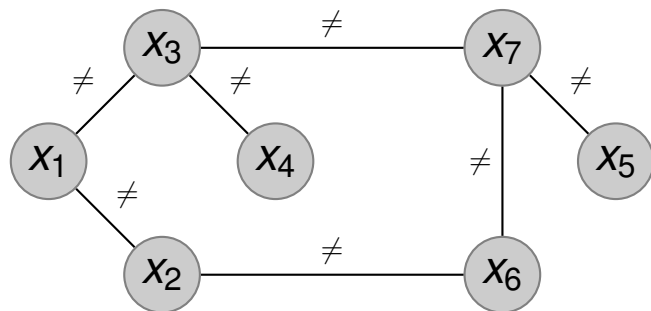
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### Question

What is the complexity of CSP( $\Gamma$ ) for different  $\Gamma$ ?

## Graph coloring (two colors)



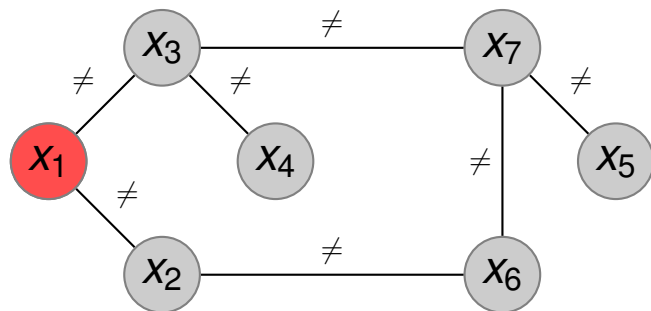
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Domain  $D = \{\text{red}, \text{blue}\}$

Constraint language  $\Gamma = \{\neq\}$ .



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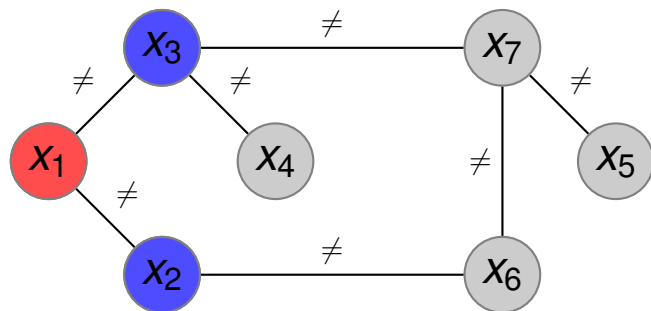


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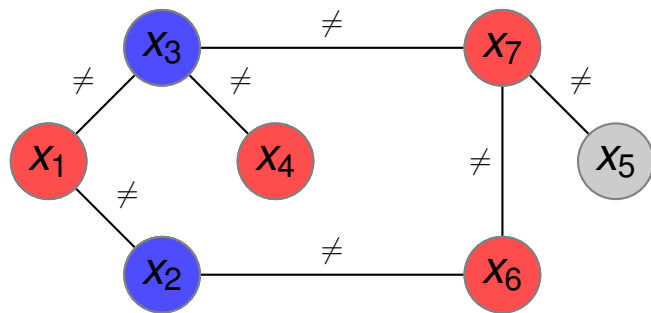


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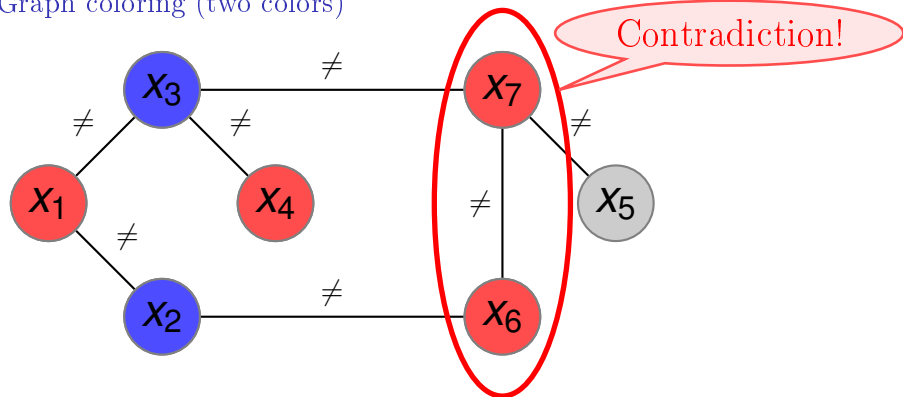


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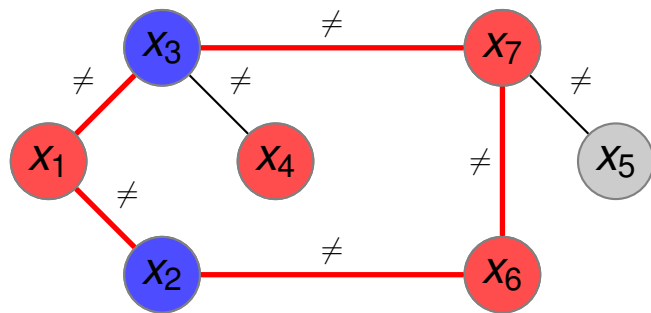


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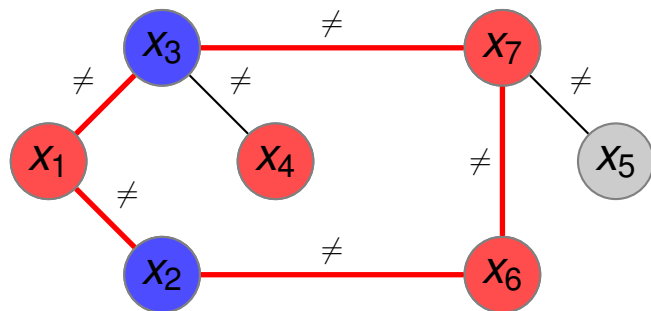


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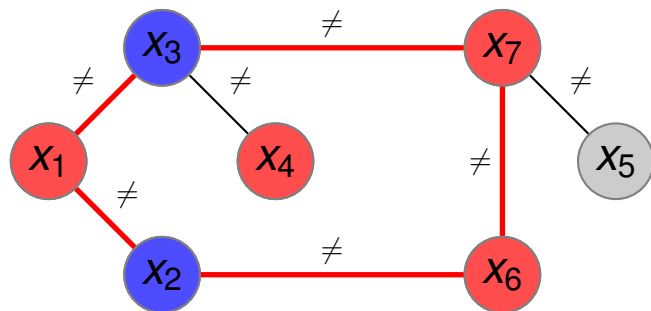
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Local consistency check solves the problem.

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## System of linear equations in a finite field

$$\begin{cases} x_1 + x_2 + 2x_3 = 0 & \text{mod } 3 \\ x_1 + 2x_3 + x_5 = 0 & \text{mod } 3 \\ 2x_2 + x_4 + x_5 = 0 & \text{mod } 3 \\ x_1 + x_3 + 2x_5 = 1 & \text{mod } 3 \end{cases}$$

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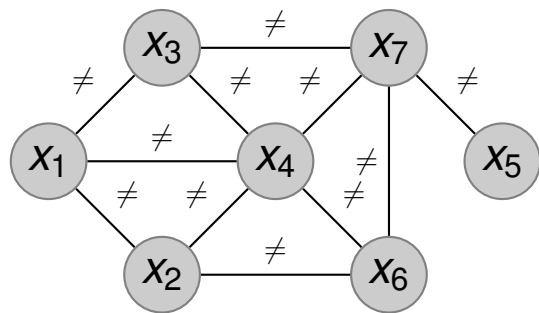
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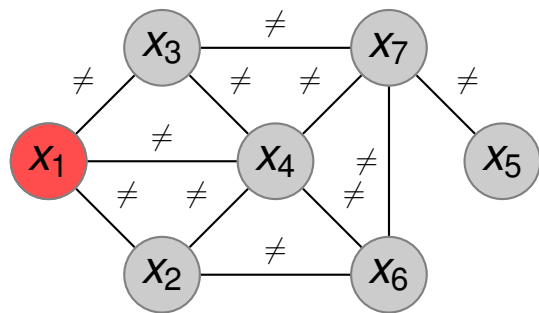


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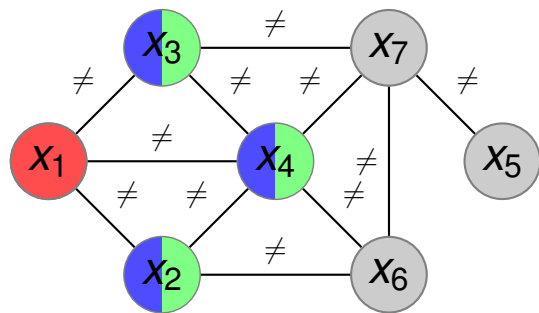


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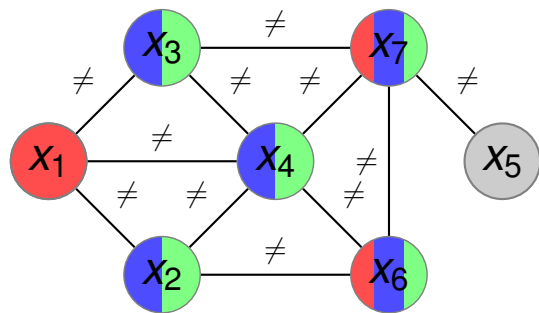


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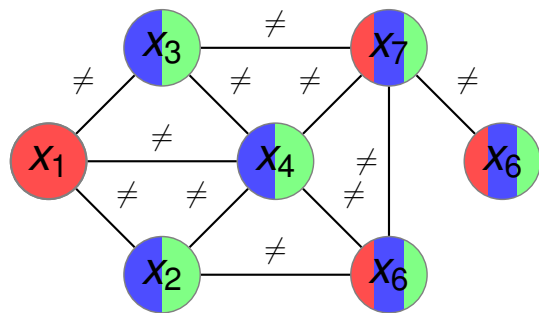


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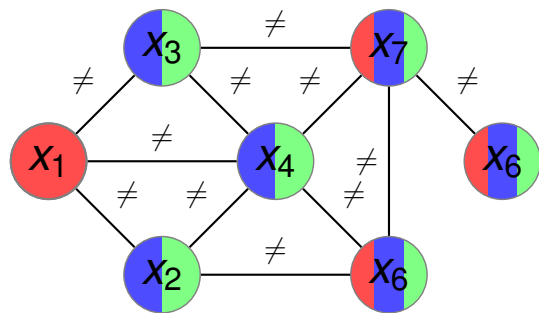


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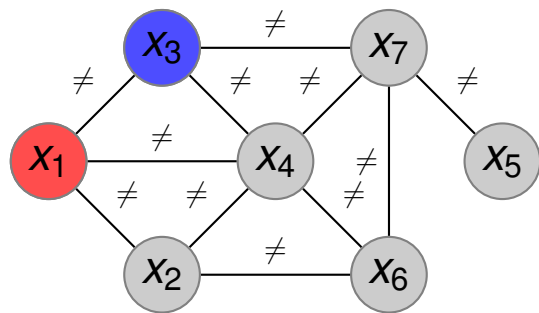
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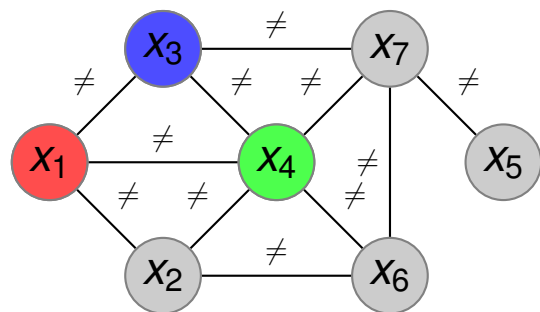
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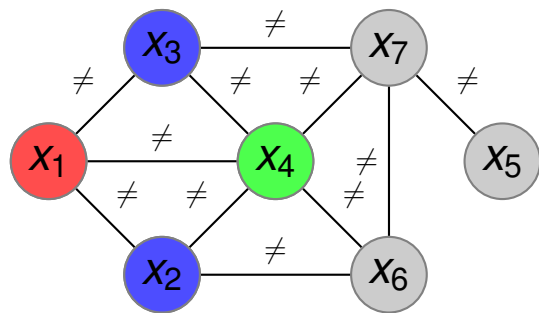
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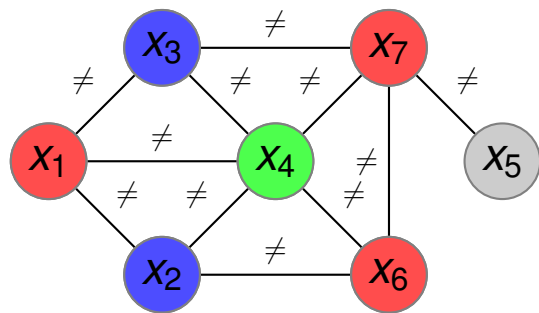
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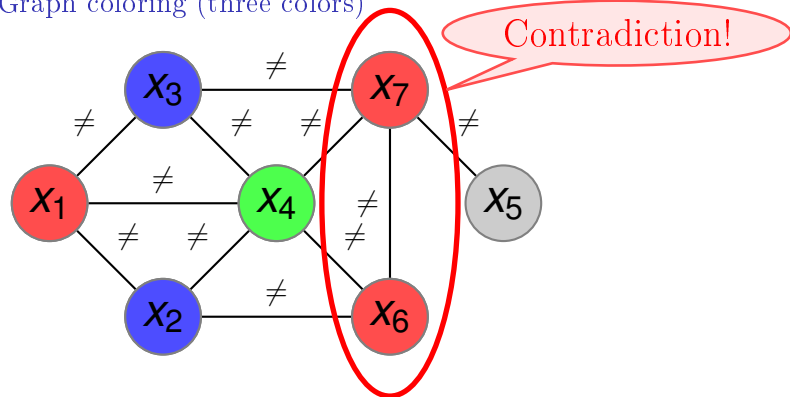
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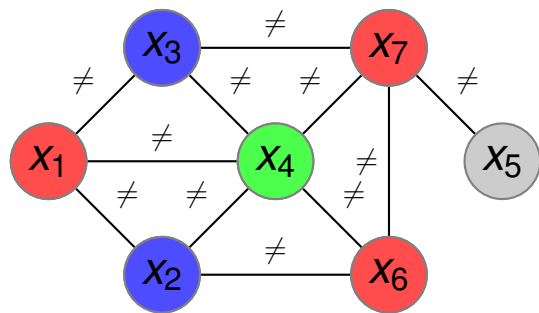
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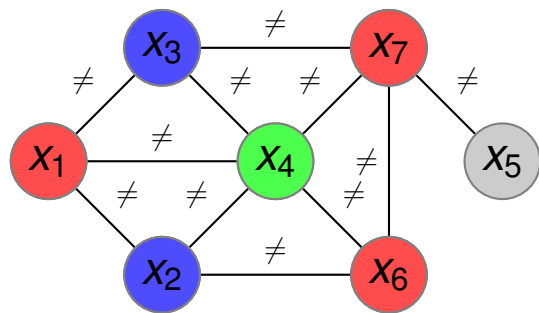
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The problem is NP-hard.

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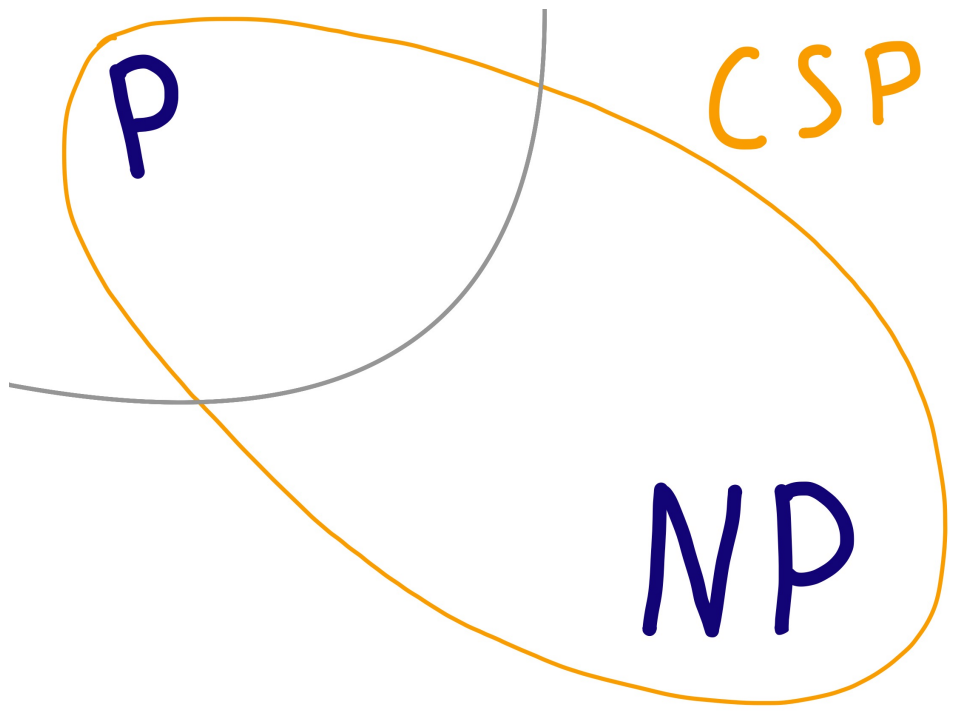
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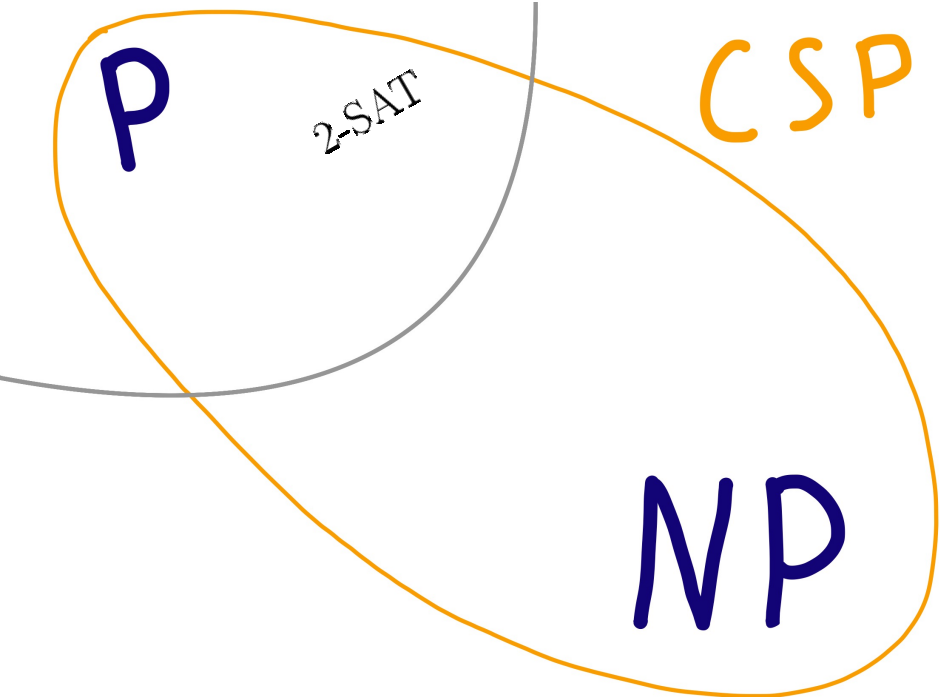


P

2-SAT

CSP

NP





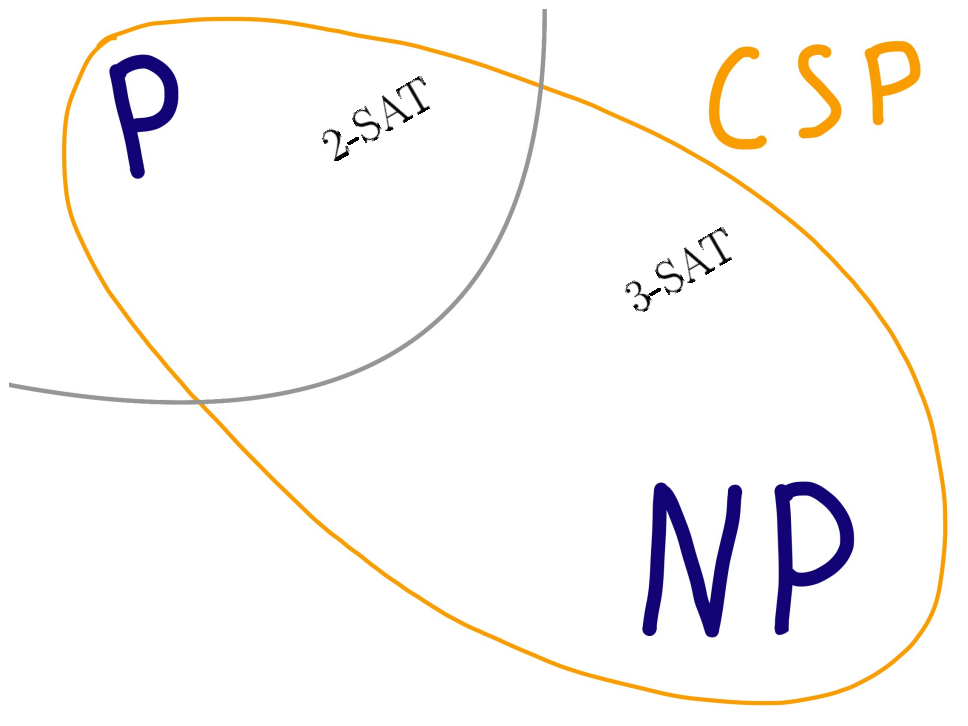
**P**

2-SAT

**CSP**

3-SAT

**NP**



**P**

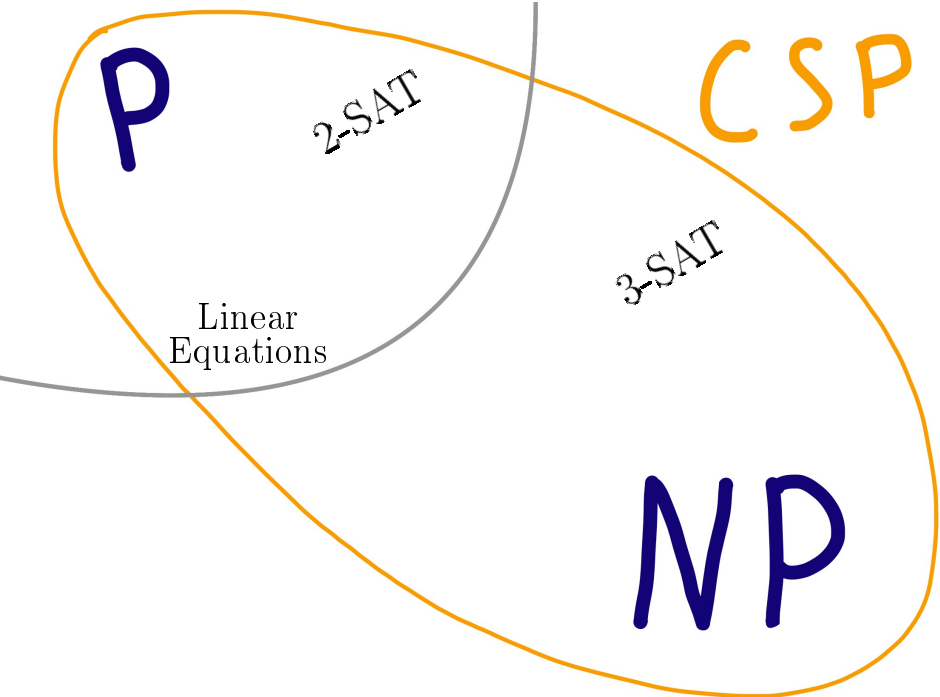
2-SAT

Linear  
Equations

**CSP**

3-SAT

**NP**



**P**

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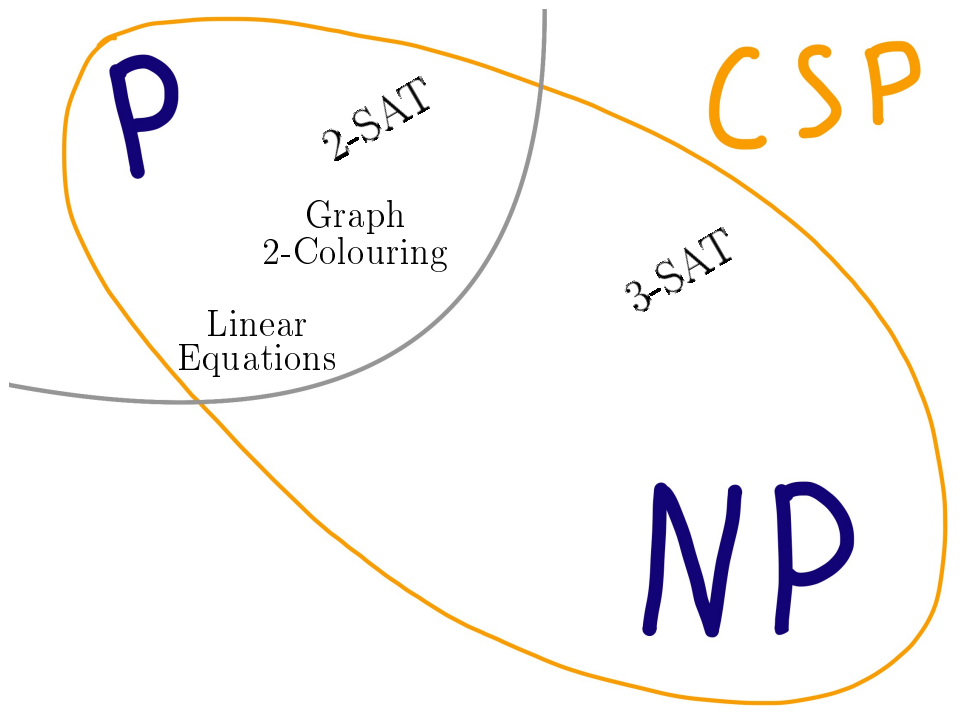
Graph  
2-Colouring

Linear  
Equations

**CSP**

3-SAT

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**P**

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**NP**

Reduction from one language to another

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### Theorem [Bodnarchuk, Kaluzhnin, Kotov, Romov, Geiger, 1969]

$\Gamma_2$  pp-defines  $\Gamma_1$  IFF every operation preserving  $\Gamma_2$  preserves  $\Gamma_1$

# Polymorphisms

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Examples:  $x \vee y, x \wedge y, xy \vee xz \vee yz, x + y + z, 0, \min(x, y), \dots$

Hardness part

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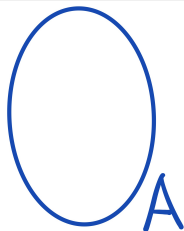
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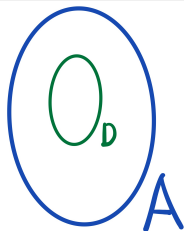
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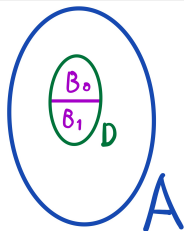
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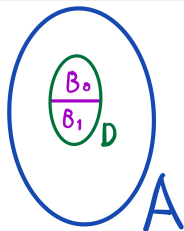




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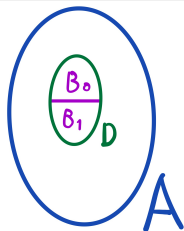
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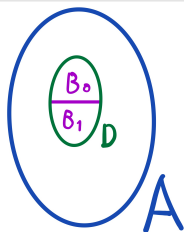
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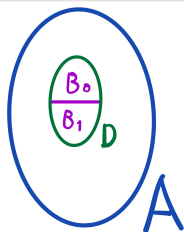
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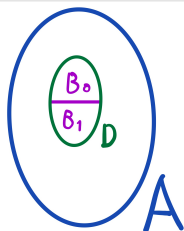
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- ▶  $\text{CSP}(\Delta)$  is log-space reducible to  $\text{CSP}(\Gamma)$  for any finite constraint language  $\Delta$ .

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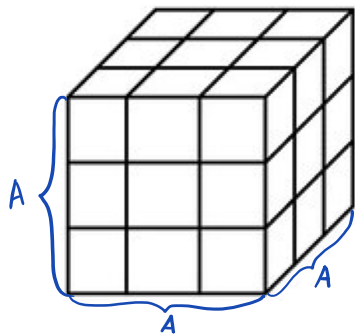
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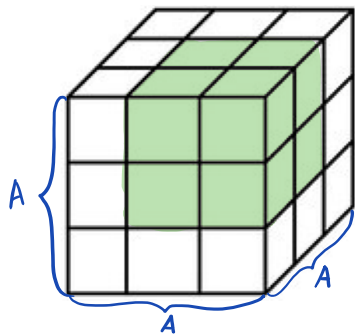
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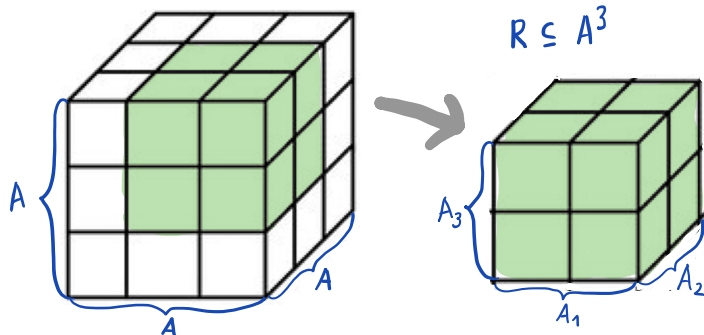
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$$(x_1 + \cdots + x_m = c) \vee (x_{m+1} = d_{m+1}) \vee \cdots \vee (x_n = d_n)$$

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- Real algorithm is much harder.

To sum up

To sum up

WNU  
polymorphism



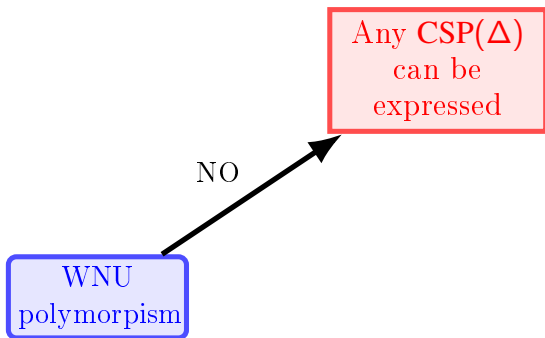
To sum up

NO

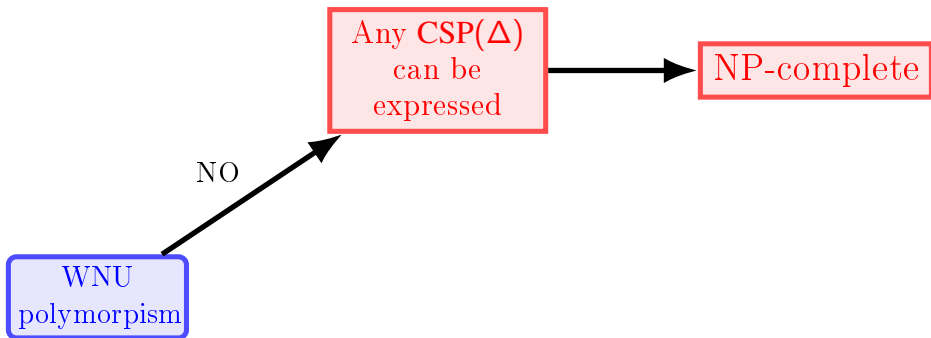


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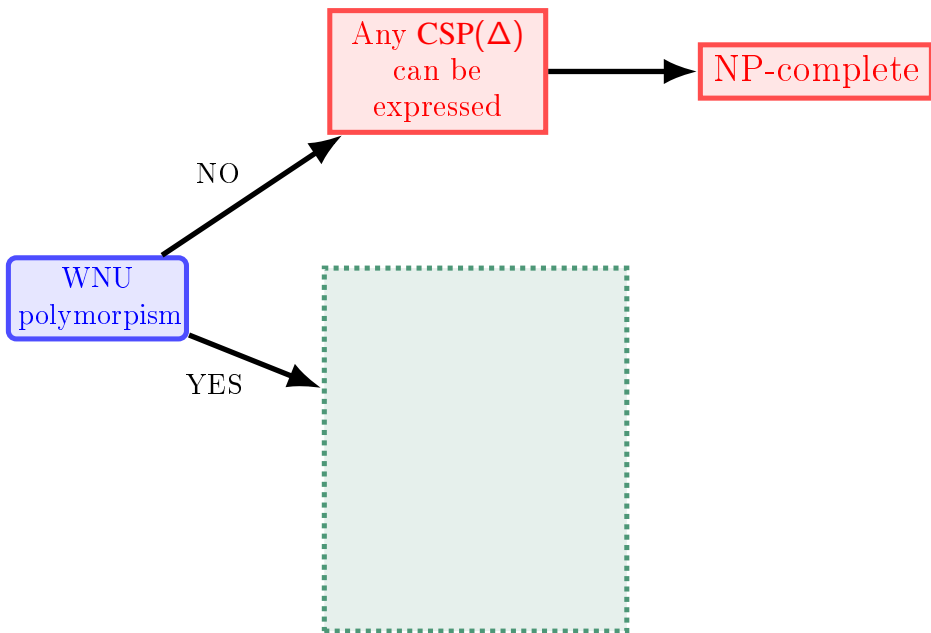
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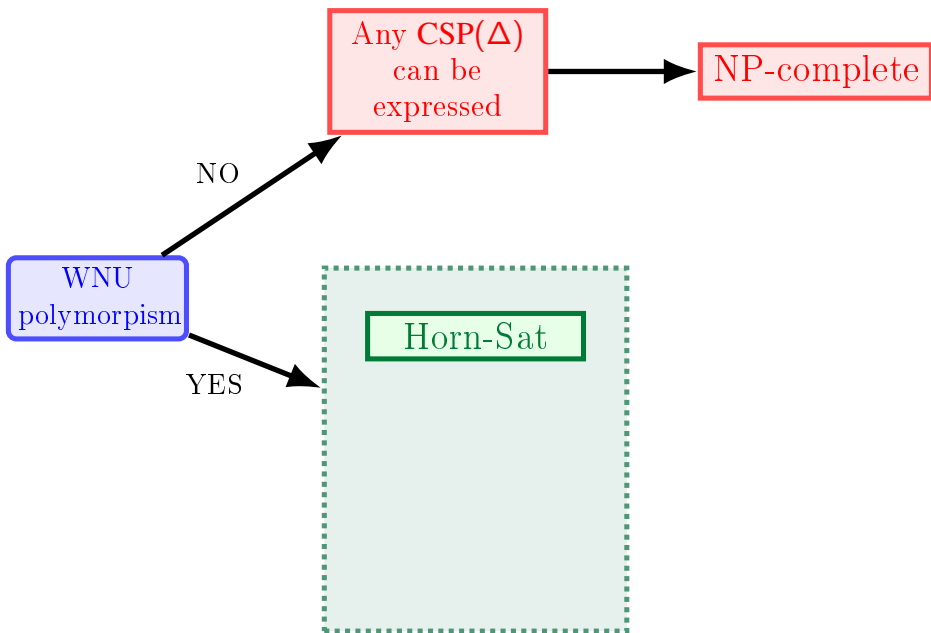
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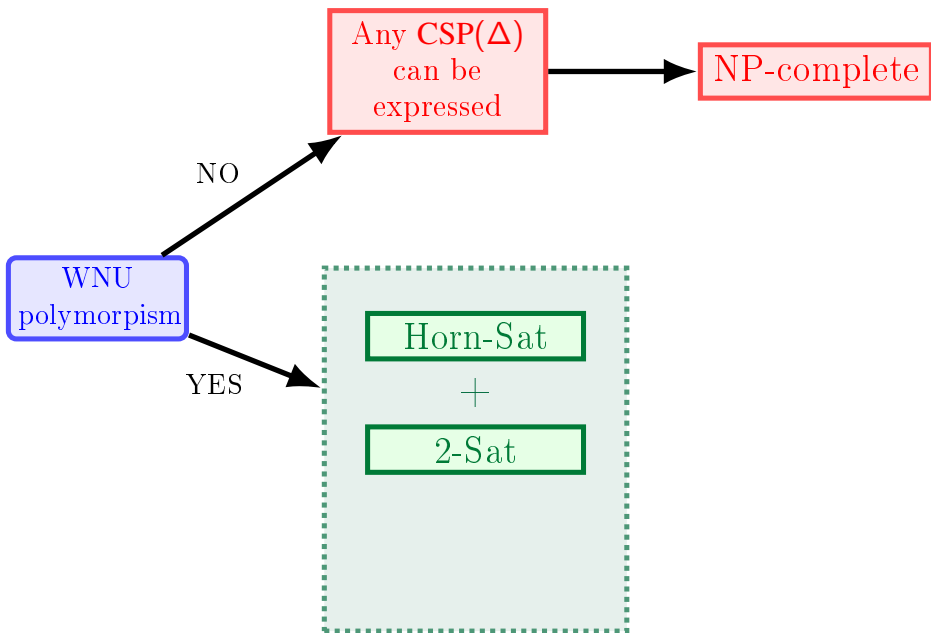
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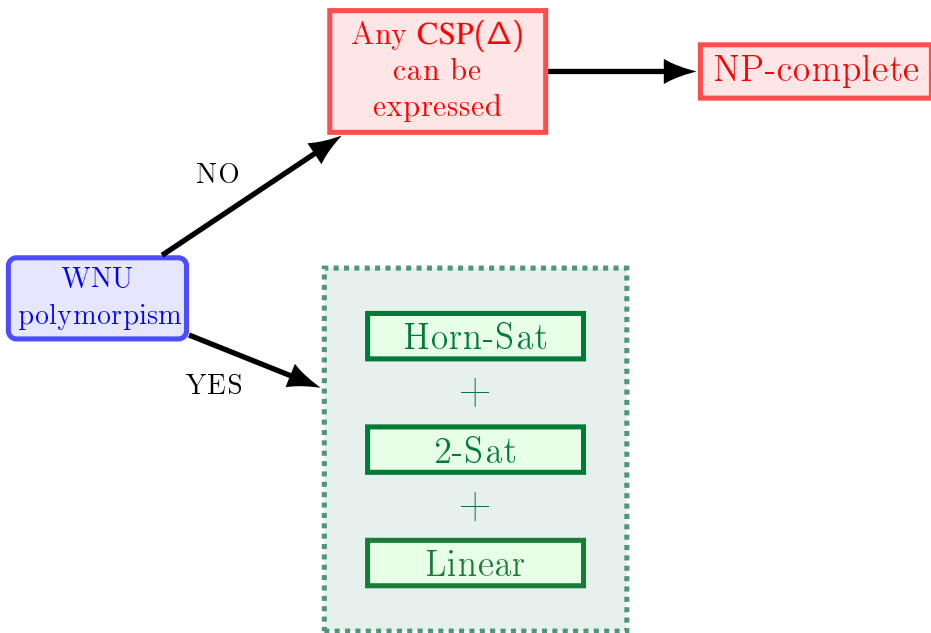
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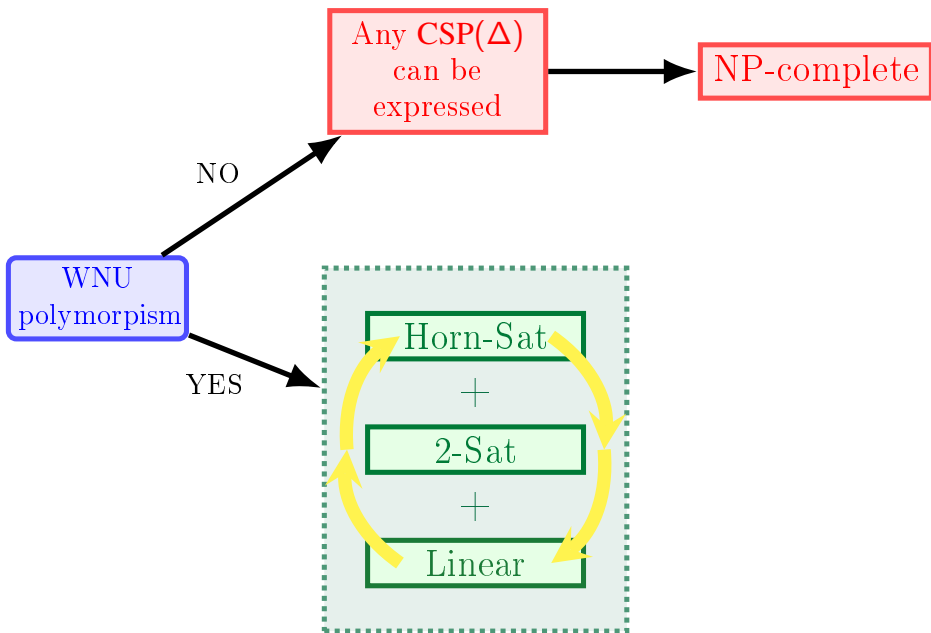
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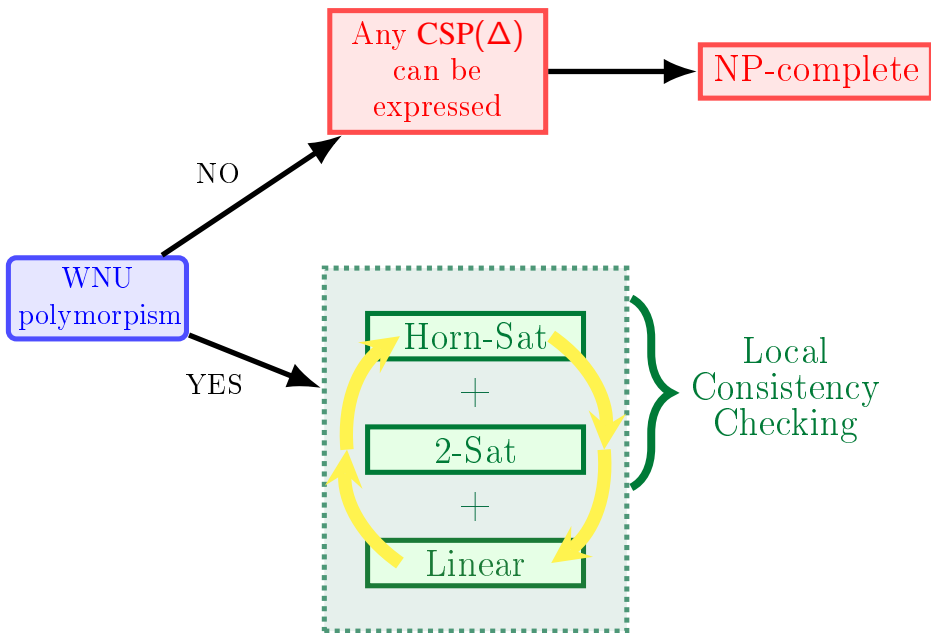


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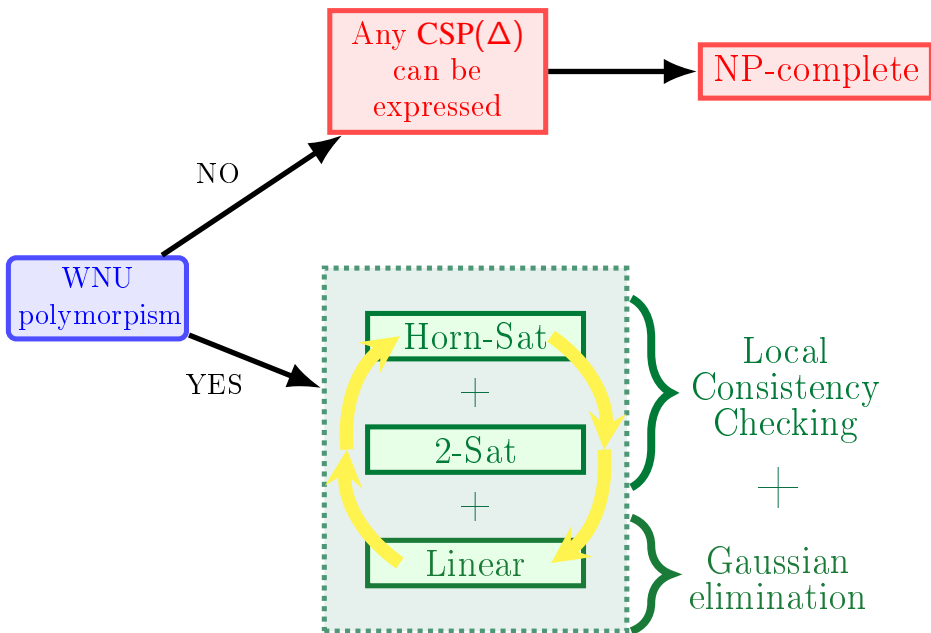




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To sum up



		CSP					
Domain	finite						
	infinite						

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Full classification

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Full classification

## Infinite Domain CSP

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Decide: whether the formula is satisfiable.

P

NP

P

NP

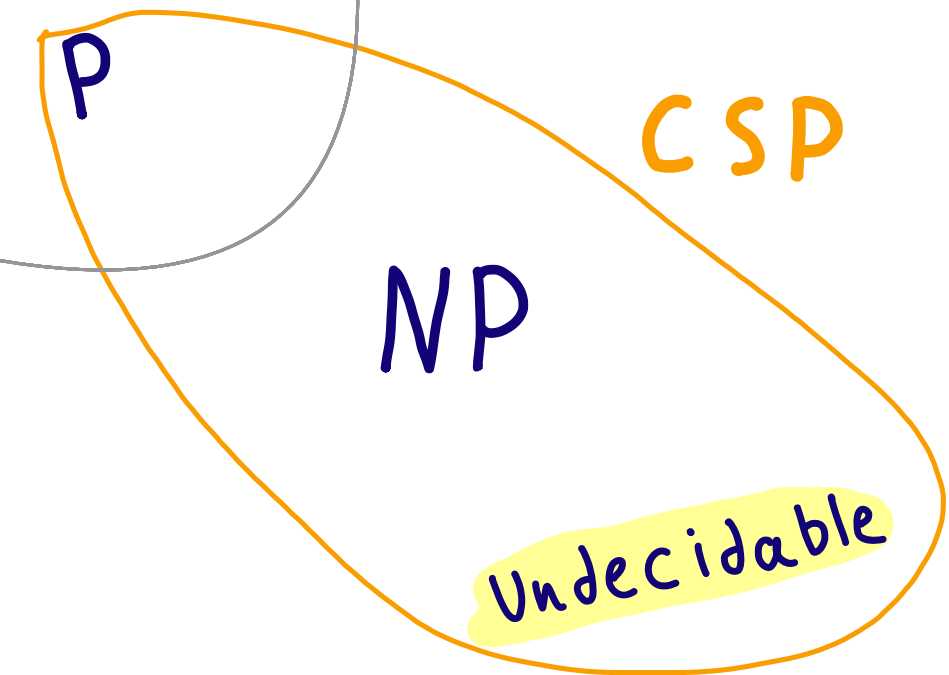
Undecidable

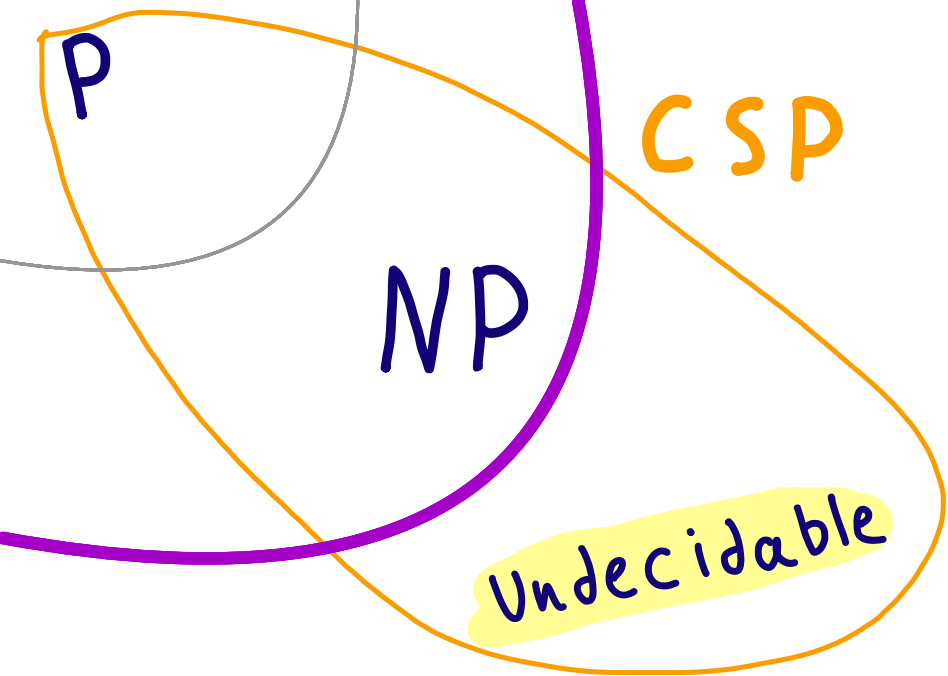
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CSP

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The instance has a solution IFF there is no oriented cycle.

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### Classification for temporal constraint languages [Bodirsky, Kára, 2008]

A full classification of the complexity for constraint languages admitting a first-order definition in  $(\mathbb{Q}; <)$  (P vs NP-complete).

		CSP					
Domain	finite						
	infinite						



Full classification

		CSP					
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Full classification



Some classifications

		CSP	Quantified CSP				
Domain	finite						
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Full classification



Some classifications

## Quantified Constraint Satisfaction Problem

$\Gamma$  is a set of relations on a finite set  $A$ .

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Given: a sentence

$$\exists x_1 \dots \exists x_n R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_s(x_{i_s,1}, \dots, x_{i_s,n_s}),$$

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$\forall x_1 \forall x_2 \forall x_3 \exists y (x_1 \neq y \wedge x_2 \neq y \wedge x_3 \neq y)$ ,

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$\Gamma$  is a set of relations on a finite set  $A$ .

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### Question

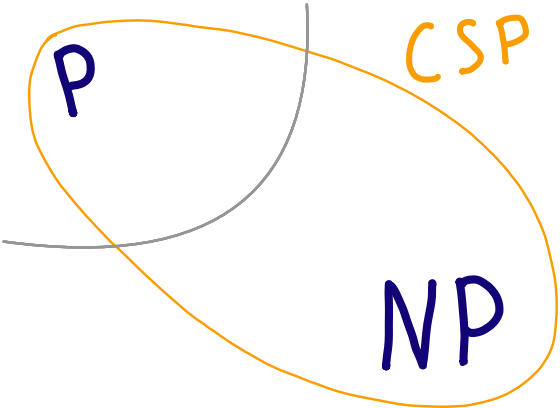
What is the complexity of QCSP( $\Gamma$ ) for different  $\Gamma$ ?

A Venn diagram illustrating the relationship between complexity classes. A large orange oval encloses the entire diagram. Inside, a smaller grey oval is positioned on the left side, containing the letter 'P'. To the right of the grey oval, the letters 'CSP' are written in orange. Below the grey oval and to the right, the letters 'NP' are written in blue. The orange oval overlaps the grey oval, and the 'NP' text is located within the orange oval but outside the grey oval.

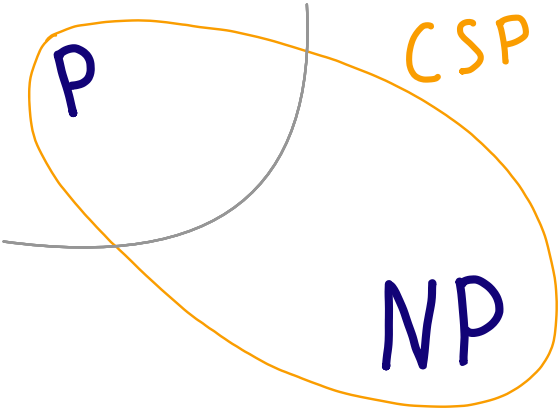
P

CSP

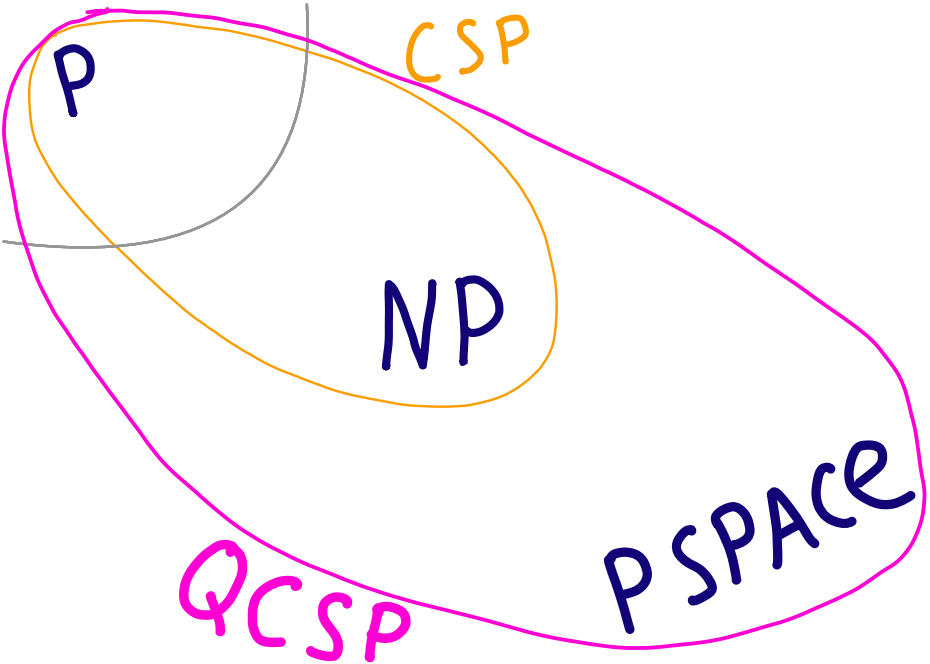
NP







PSPACE



## QCSP Complexity Classes

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Theorem [Schaefer 1978 + Creignou et al. 2001/ Dalmau 1997.]

Suppose  $\Gamma$  is a constraint language on  $\{0, 1\}$ . Then

- ▶  $\text{QCSP}(\Gamma)$  is in P if  $\Gamma$  is preserved by an idempotent WNU operation,
- ▶  $\text{QCSP}(\Gamma)$  is PSPACE-complete otherwise.



# QCSP Complexity Classes



## QCSP Complexity Classes

- ▶ Put  $A' = A \cup \{*\}$ ,  $\Gamma'$  is  $\Gamma$  extended to  $A'$ . Then  $\text{QCSP}(\Gamma')$  is equivalent to  $\text{CSP}(\Gamma)$ .





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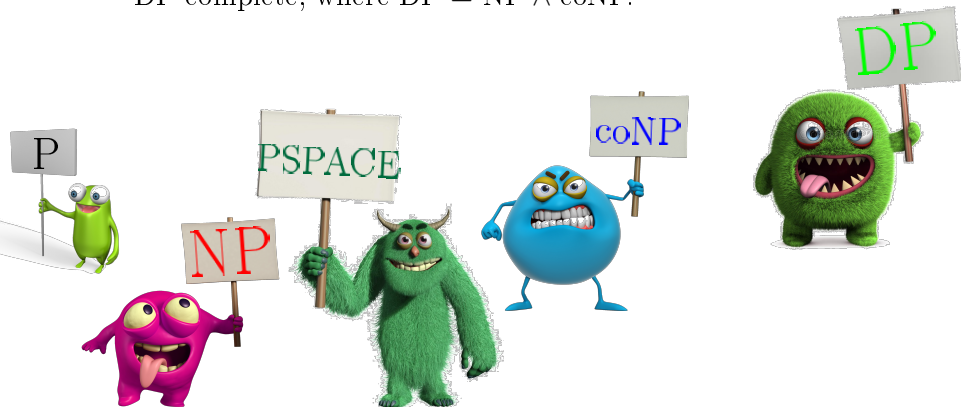
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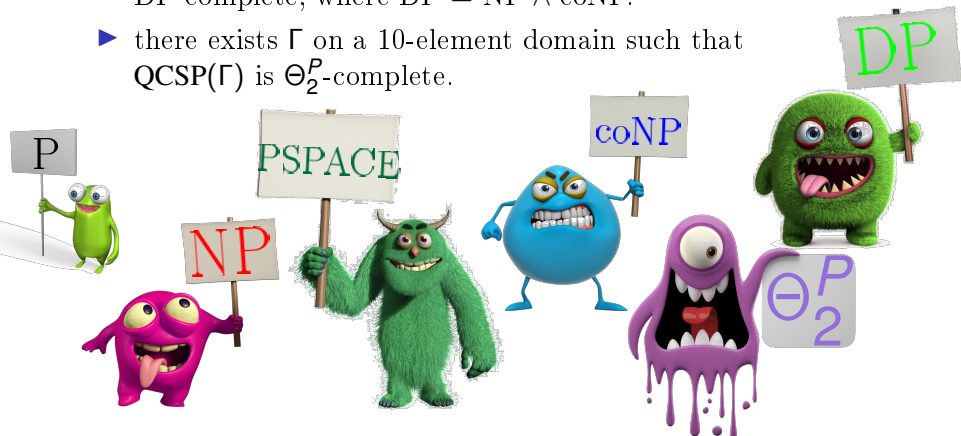
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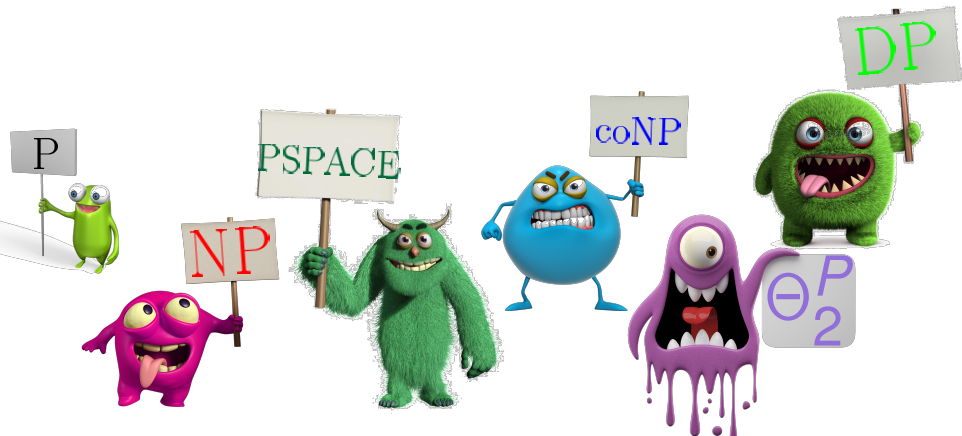


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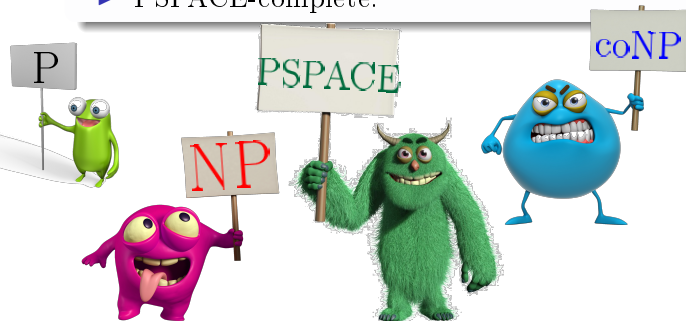


## QCSP Complexity Classes

Theorem [Zhuk, Martin, 2019]

Suppose  $\Gamma$  is a constraint language on  $\{0, 1, 2\}$  containing  $\{x = a \mid a \in \{0, 1, 2\}\}$ . Then  $\text{QCSP}(\Gamma)$  is

- ▶ in P, or
- ▶ NP-complete, or
- ▶ coNP-complete, or
- ▶ PSPACE-complete.



## QCSP Complexity Classes

Theorem [Zhuk, 2021]

QCSP( $\Gamma$ )

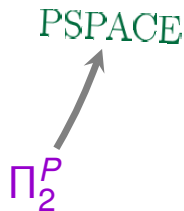
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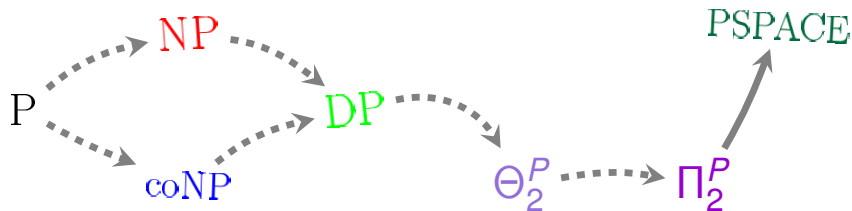


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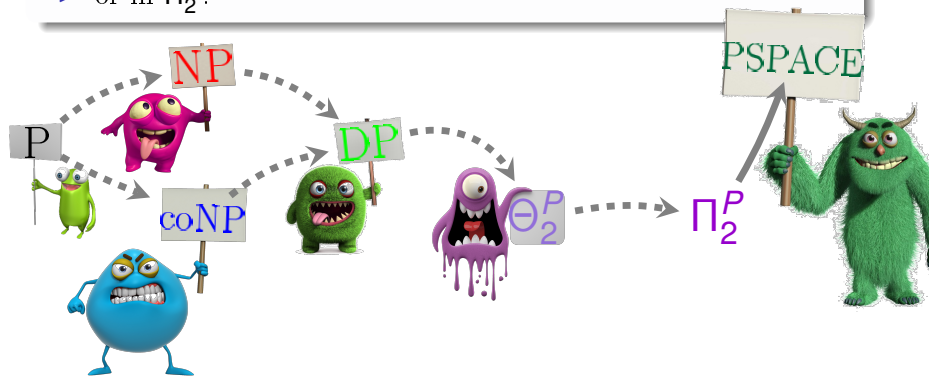


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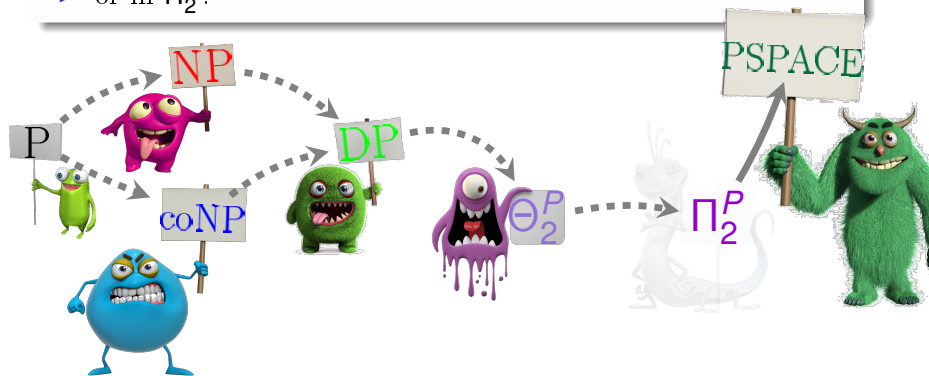


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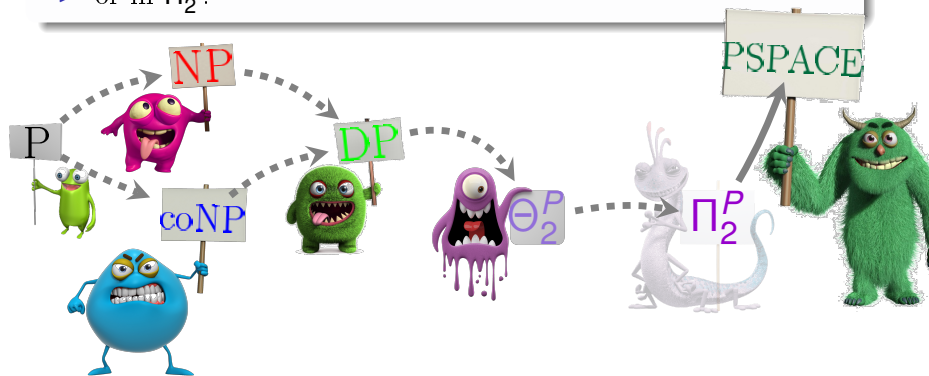


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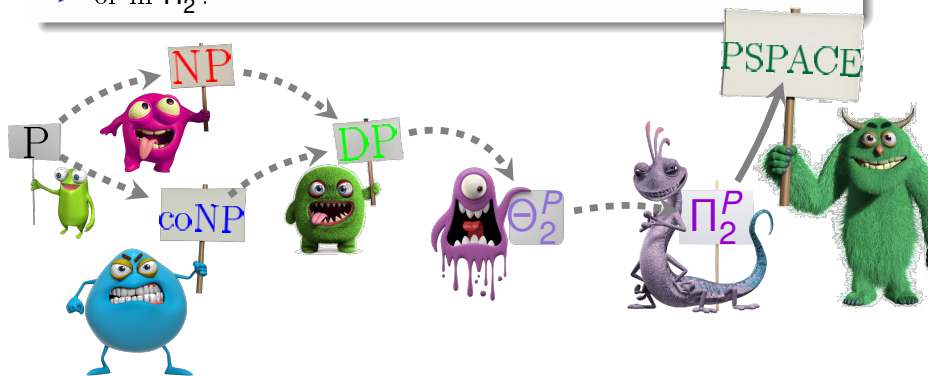


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Are there any other complexity classes?

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Domain	finite						
	infinite						



Full classification



Some classifications



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Full classification



Partial classification (for larger domains)



Some classifications

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A full classification of the complexity for constraint languages whose relations are boolean combinations of equalities. (P, NP-complete, PSPACE-complete)

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What is the complexity of QCSP( $\{x = y \rightarrow z > t\}$ )?

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Full classification



Partial classification (for larger domains)



Some classifications

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Partial classification (for larger domains)



Some classifications

		CSP	Quantified CSP	Valued CSP			
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Some classifications

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Decide: whether  $f_1(\dots) + f_2(\dots) + \dots + f_s(\dots) < T$  is satisfiable.

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- ▶ VCSP( $\{f\}$ ) is NP-complete.

## Valued Constraint Satisfaction Problem

$\Gamma$  is a set of cost functions on a finite set  $A$ , i.e. mappings  $A^n \rightarrow \mathbb{Q} \cup \{\infty\}$ .

### VCSP( $\Gamma$ )

Given: a threshold  $T$  and a sum  $f_1(\dots) + f_2(\dots) + \dots + f_s(\dots)$ , where  $f_1, \dots, f_s \in \Gamma$ .

Decide: whether  $f_1(\dots) + f_2(\dots) + \dots + f_s(\dots) < T$  is satisfiable.

### Example

$$A = \{0, 1\}, f(x, y) = \begin{cases} 1, & \text{if } x = y \\ 0, & \text{otherwise} \end{cases}$$

- ▶  $f(x_1, x_2) + f(x_1, x_3) + f(x_2, x_3) < 2$  is an instance VCSP( $\{f\}$ )
- ▶ VCSP( $\{f\}$ ) is equivalent to MAX-CUT problem.
- ▶ VCSP( $\{f\}$ ) is NP-complete.

### Complexity classification

[Kolmogorov, Krokhin, Rolínek, 2015+Bulatov, Zhuk, 2017]

A full classification of the complexity for any finite set of cost functions  $\Gamma$  (P vs NP-complete).

		CSP	Quantified CSP	Valued CSP			
Domain	finite						
	infinite						








Full classification



Partial classification (for larger domains)



Some classifications

		CSP	Quantified CSP	Valued CSP			
Domain	finite						
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Full classification



Partial classification (for larger domains)



Some classifications



		CSP	Quantified CSP	Valued CSP	Promise CSP		
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There are two versions of each relation (weak and strong) in  $\Gamma$

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### Theorem [Ficak, Kozik, Olsák, Stankiewicz, 2019])

A classification of the complexity of PCSP( $\Gamma$ ) for  $\Gamma$  consisting of symmetric relations on  $\{0, 1\}$ .

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### Open questions

- ▶ What is the complexity of  $(3, 6)$ -colorability?

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- ▶ What is the complexity of  $(3, 1000000000)$ -colorability?

		CSP	Quantified CSP	Valued CSP	Promise CSP		
Domain	finite						
	infinite						



Full classification



Partial classification (for larger domains)



Some classifications

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Domain	finite						
	infinite						



Full classification



Partial classification (for larger domains)



Some classifications



		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
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Full classification



Partial classification (for larger domains)



Some classifications

## Counting Constraint Satisfaction Problem

$\Gamma$  is a set of relations on a finite set  $A$ .

### Counting-CSP( $\Gamma$ )

Given: a formula  $R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_S(x_{i_S,1}, \dots, x_{i_S,n_S})$ ,  
where  $R_1, \dots, R_S \in \Gamma$ .

Find the number of solutions.

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Find the number of solutions.

### Theorem [Bulatov, 2008]

A classification of the complexity of Counting-CSP( $\Gamma$ ) for every  $\Gamma$ .

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						



Full classification



Partial classification (for larger domains)



Some classifications

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Domain	finite						
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Full classification



Partial classification (for larger domains)



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	infinite						



Full classification



Partial classification (for larger domains)



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint							



Full classification



Partial classification (for larger domains)



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						



Full classification



Partial classification (for larger domains)



Some classifications



## Surjective Constraint Satisfaction Problem

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$\Gamma$  is a set of relations on  $A$ .

### SCSP( $\Gamma$ )

Given: a conjunction of relations, i.e. a formula

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where  $R_1, \dots, R_S \in \Gamma$ .

Decide: whether the formula has a **surjective** solution, that is, a solution such that  $\{x_1, \dots, x_n\} = A$ .

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### Question

What is the complexity of the SCSP( $\Gamma$ )?



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SurjHom( $H$ ):

Given: a graph  $G$ .

Decide: whether there exists a **surjective** homomorphism from  $G$  to  $H$ .

## Surjective Graph Homomorphism Problem

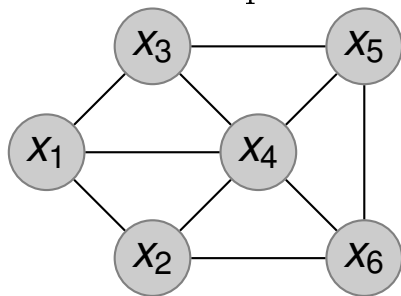
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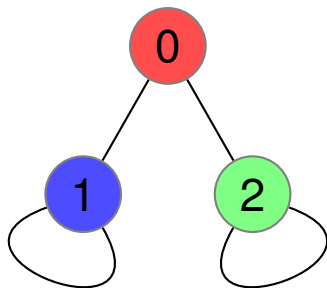
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Graph  $G$



Graph  $H$



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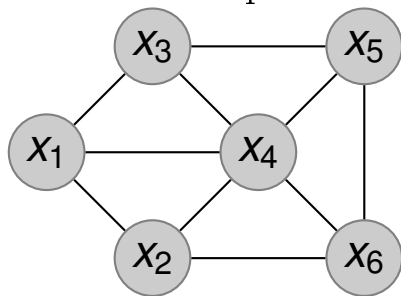
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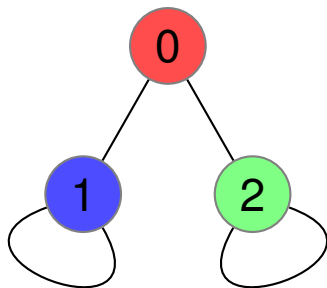
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Graph  $G$



Graph  $H$



SurjHom( $H$ ) is equivalent to SCSP( $\{x + y \neq 0 \pmod{3}\}$ ).

# History

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- ▶ The complexity cannot be described in terms of polymorphisms [Zhuk, 2020]

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	■	■	■	■	■	
	infinite	■	■				
Global Constraint	surjective	■					



Full classification



Partial classification (for larger domains)



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					
	balanced						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



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Decide: whether it has a **balanced** solution, i.e., a solution with equal number of every element.

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### Balanced-CSP(=) on $\{0, 1\}$

Given an instance  $x_{i_1} = x_{j_1} \wedge \dots \wedge x_{i_s} = x_{j_s}$ . Decide whether it has a solution with equal number of 0 and 1.

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### Balanced-CSP( $\Gamma$ )

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Decide: whether it has a **balanced** solution, i.e., a solution with equal number of every element.

### Balanced-CSP(=) on $\{0, 1\}$

Given an instance  $x_{i_1} = x_{j_1} \wedge \dots \wedge x_{i_s} = x_{j_s}$ . Decide whether it has a solution with equal number of 0 and 1.

### Balanced-CSP( $\leq$ ) on $\{0, 1\}$

Given an instance  $x_{i_1} \leq x_{j_1} \wedge \dots \wedge x_{i_s} \leq x_{j_s}$ . Decide whether it has a solution with equal number of 0 and 1.

## Balanced CSP

$\Gamma$  is a set of relations on a finite set  $A$ .

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### Theorem [Creignou, H. Schnoor, I. Schnoor, 2008]

A classification of the complexity of Balanced-CSP( $\Gamma$ ) and Cardinality-CSP( $\Gamma$ ) for each  $\Gamma$  on  $\{0, 1\}$ .

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					
	balanced						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



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Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

## Global cardinality constraint

$\Gamma$  is a set of relations on a finite set  $A$ .

### Cardinality-CSP( $\Gamma$ )

Given: a mapping  $\pi: A \rightarrow \mathbb{N}$  and a formula

$R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_s(x_{i_s,1}, \dots, x_{i_s,n_s})$ , where  
 $R_1, \dots, R_s \in \Gamma$ .

Decide: whether it has a solution containing each element  $a \in A$   
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### Cardinality-CSP(Linear Equations in $\mathbb{Z}_2$ )

Given a system of linear equations in  $\mathbb{Z}_2$  and  $k \in \mathbb{N}$ .

Decide whether there exists a solution with exactly  $k$  1s.

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### Theorem [Bulatov, Marx, 2009]

A classification of the complexity of Cardinality-CSP( $\Gamma$ ) for each  $\Gamma$ .

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					
	balanced	Classification for 2-element domain					
	cardinality	Full classification					



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



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Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					
	balanced	Classification for 2-element domain					
	cardinality	Full classification					
	modulo $M$						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

## Global modular constraint

### *Mod*<sub>M</sub>-CSP( $\Gamma$ )

Given: a formula  $R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_S(x_{i_S,1}, \dots, x_{i_S,n_S})$ ,  
where  $R_1, \dots, R_S \in \Gamma$ .

Decide: whether it has a solution satisfying  $x_1 + \dots + x_n = 0$   
mod  $M$ .

### $Mod_M\text{-CSP}(\Gamma)$

Given: a formula  $R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_S(x_{i_S,1}, \dots, x_{i_S,n_S})$ ,  
where  $R_1, \dots, R_S \in \Gamma$ .

Decide: whether it has a solution satisfying  $x_1 + \dots + x_n = 0 \pmod M$ .

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### $Mod_M\text{-CSP}(\Gamma)$

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- ▶ If  $\Gamma$  consists of linear equations on  $\{0, 1\}$  and  $M = 15$  then  $Mod_M\text{-CSP}(\Gamma)$  is **not tractable**

**Mod<sub>M</sub>-CSP( $\Gamma$ )**

Given: a formula  $R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_S(x_{i_S,1}, \dots, x_{i_S,n_S})$ ,  
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- ▶ If  $\Gamma$  consists of linear equations on  $\{0, 1\}$  and  $M = 15$  then  $\text{Mod}_M\text{-CSP}(\Gamma)$  is **not tractable**
- ▶ If  $\Gamma$  consists of linear equations on  $\{0, 1\}$  and  $M = 24$  then the complexity of  $\text{Mod}_M\text{-CSP}(\Gamma)$  is **not known**.

$$\begin{cases} x_1 + x_2 + x_3 = 0 & \text{mod } 2 \\ x_1 + x_3 + x_5 = 0 & \text{mod } 2 \\ x_2 + x_4 + x_5 = 1 & \text{mod } 2 \\ x_2 + x_3 + x_5 = 0 & \text{mod } 24 \end{cases}$$

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
	infinite	Some classifications	Some classifications				
Global Constraint	surjective	Classification for 2-element domain					
	balanced	Classification for 2-element domain					
	cardinality	Full classification					
	modulo $M$						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications

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Domain	finite	Full classification	Partial classification (for larger domains)	Full classification	Some classifications	Full classification	
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Global Constraint	surjective	Classification for 2-element domain					
	balanced	Classification for 2-element domain					
	cardinality	Full classification					
	modulo $M$	Some results					



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction							



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results



		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results

## Edge Constraint Satisfaction Problem

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Given: a formula  $R_1(x_{i_1,1}, \dots, x_{i_1,n_1}) \wedge \dots \wedge R_s(x_{i_s,1}, \dots, x_{i_s,n_s})$ ,  
where  $R_1, \dots, R_s \in \Gamma$  and every variable appears exactly twice.

Decide: whether it has a solution.

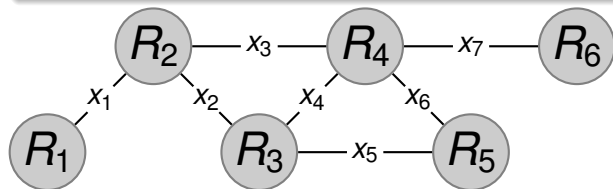
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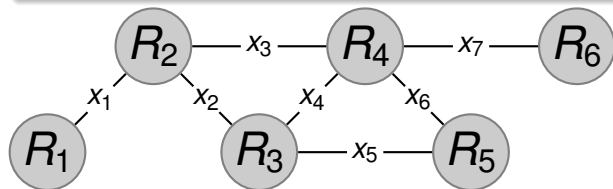
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- ▶ Edge-CSP( $\{1IN2, 1IN3, 1IN4, \dots\}$ ) is equivalent to the Perfect Matching Problem.

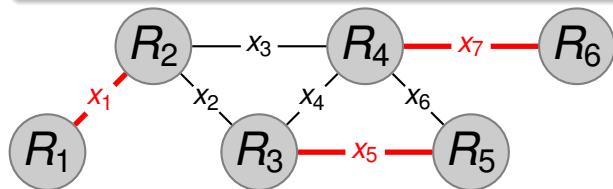
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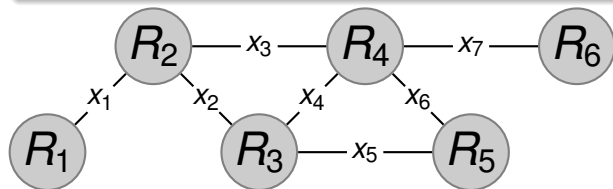
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Decide: whether it has a solution.



- ▶ Edge-CSP( $\{1IN2, 1IN3, 1IN4, \dots\}$ ) is equivalent to the Perfect Matching Problem.

### Theorem [Kazda, Kolmogorov, Rolinek, 2018]

A classification of the complexity for planar Edge-CSP( $\Gamma$ ) for every  $\Gamma$  on  $\{0, 1\}$ .

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results



		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						



Full classification



Partial classification (for larger domains)
















Classification for 2-element domain



Some classifications



Some results

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	Approxim. CSP
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						
	planar						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results

		CSP	Quantified CSP	Valued CSP	Promise CSP	Counting CSP	Approxim. CSP
Domain	finite						
	infinite						
Global Constraint	surjective						
	balanced						
	cardinality						
	modulo $M$						
Structural Restriction	edge						
	planar						



Full classification



Partial classification (for larger domains)



Classification for 2-element domain



Some classifications



Some results