

Challenges in Infinite Domain Constraint Satisfaction

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Infinite-Domain CSPs

Two Research Directions:

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Part I: ω -categorical templates

The Universal-Algebraic Approach

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2 **Apply the method!**

Permutations

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Finite permutations can be represented by two linear orders:

(3142) corresponds to $(\{a, b, c, d\}; <_1, <_2)$ such that

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$\text{Age}(\Gamma)$ equals

- $\text{Forb}(12)$
- $\text{Forb}(21)$
- $\text{Forb}(231, 312)$
- $\text{Forb}(213, 132)$
- $\text{Forb}(\emptyset)$

$\text{Forb}(\mathcal{S})$: class of all finite permutations that do not embed any $S \in \mathcal{S}$.

The Random Permutation

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Challenge 1: Classify $\text{CSP}(\Gamma)$ for all reducts Γ of Δ .

Forbidden Permutations Problems

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- Problem is closed under disjoint unions and inverse homomorphisms.
- Hence, this problem is the CSP for an infinite structure Γ .
- The permutations in $\text{Forb}(3142, 2413)$ are called **separable** in finite combinatorics.

Separable Permutations

Illustration of (3142) and (2413):

		X	
X			
			X
	X		

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if S_1, S_2 are separable, then

	S_2
S_1	

 and

S_1	
	S_2

are separable, too.

An ω -categorical separable template

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Observation (Cameron'02): Expansion by ternary relation $xy|z$ defined by

$$(x <_1 y <_1 z \wedge y <_2 x <_2 z) \vee (z <_1 x <_1 y \wedge z <_2 y <_2 x)$$

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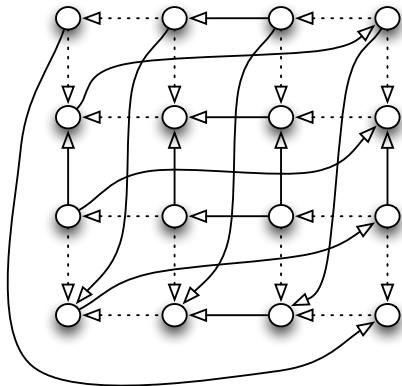
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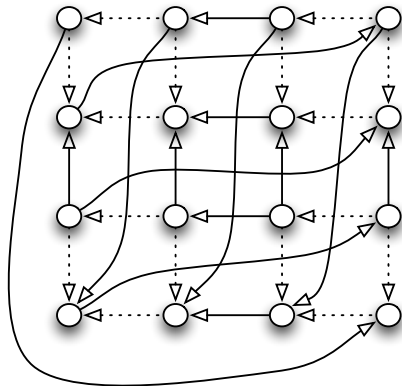
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What is the complexity of $\text{CSP}(\Gamma)$?

An Example

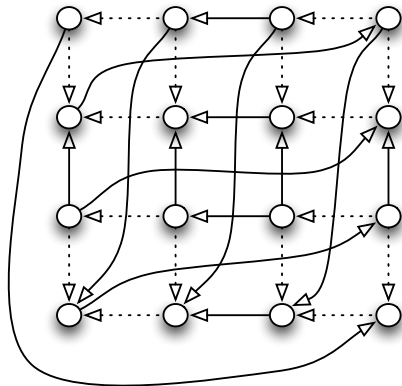


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Hanika's problem $\text{CSP}(\Gamma)$ is not in Datalog

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Atserias+Bulatov+Dawar'07: LFP = Datalog for finite CSPs.
For ω -categorical CSPs: $\text{CSP}(\Gamma) \in \text{LFP} \setminus \text{Datalog}$.

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Challenge 3: For which \mathcal{S} can this problem be formulated as the CSP for an ω -categorical template?

SNP and Fragments

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An SNP τ -sentence is an ESO τ -sentence of the form

$$\exists R_1, \dots, R_k. \forall x_1, \dots, x_l. \phi$$

where ϕ is quantifier-free over the signature $\tau \cup \{R_1, \dots, R_k\}$.

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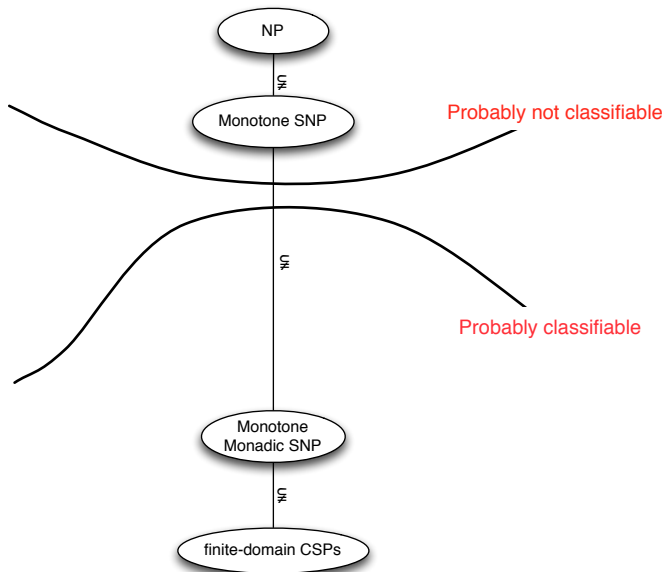
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- **monotone** if all symbols from τ appear **negatively**;
- **monadic** if R_1, \dots, R_k are **unary**.

The Results of Feder and Vardi



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Proposition.

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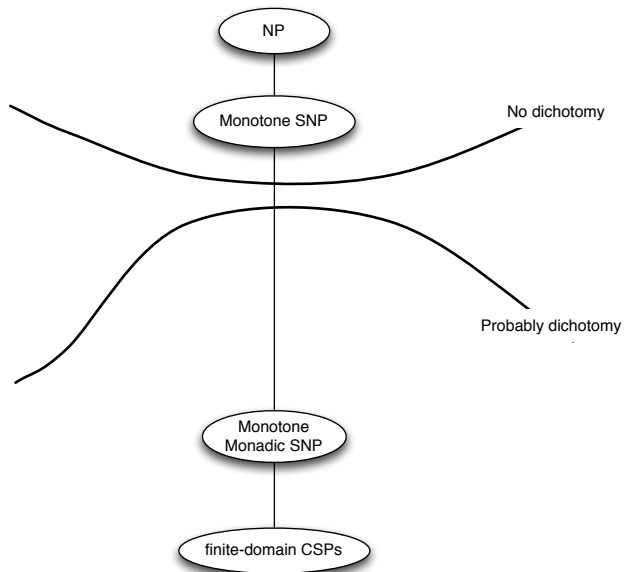
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Theorem (Feder-Vardi'97,Kun'13).

Every problem in MMSNP is computationally equivalent (under polynomial-time Turing reductions) to a finite domain CSP.

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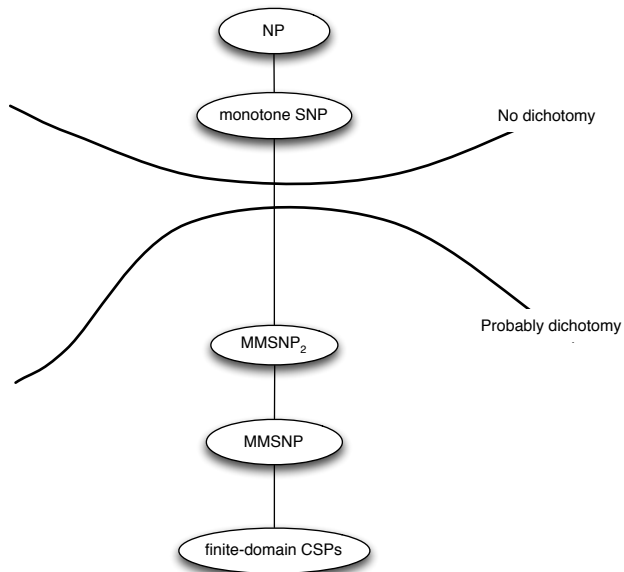
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Dichotomy for MMSNP_2 ?



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Theorem (Cherlin+Shelah+Shi'98, MB+Dalmau'06, Madelaine'09).

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Consequence: Canonical function machine can be applied systematically to study MMSNP_2 .

Further Challenges

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Challenge 5: Give a universal-algebraic characterization for tractability of problems in MMSNP_1 .

Qualitative vs Quantitative CSPs

Constraint Satisfaction Problems:

Qualitative CSPs

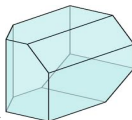
MMSNP MMSNP2 (\mathbb{Q}, \leq, \neq)
Allen's Interval Algebra

Separable Permutations CSP

Finite Domain CSPs Betweenness

Quantitative CSPs

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$(\mathbb{Z}, \text{succ})$

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Challenge 7: Does every semi-algebraic extension of linear program feasibility which is non semilinear simulate a sums-of-roots problem?

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Challenge 9: Do CSPs for reducts of $(\mathbb{Z}; 0, \text{succ})$ have a non-dichotomy?

AAA89 in Dresden

89th Workshop On General Algebra: February 26 (arrival) - March 1, 2015



Invited speakers:

Libor Barto, Georg Grätzer, Maja Pech, Gernot Salzer, John Truss