# Promise Constraint Satisfaction

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CoCoSym: Symmetry in Computational Complexity

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# Task from the organizers: talk about recent developments in the complexity of CSPs

It will be of interest to participants even if graph covers will not show up at all

#### Recent developments in fixed-template CSPs:

- computational complexity fully classified
- PCSP: promise CSP
  - new insight: LabelCover is everywhere (in (P)CSP and variants)
  - algorithmically more interesting
  - more tools are useful: algebraic topology, analysis

# CSP

# Definition

# Fix $\mathbb{A} = (A; R, S, ...)$ finite relational structure, eg. digraph (A; R)

# Definition $(CSP(\mathbb{A}))$

Input: X of the same signature as A Answer Yes:  $X \to A$  (homomorphism) Answer No:  $X \not\to A$ 

# Definition (search version of $CSP(\mathbb{A})$ )

Input:	${\mathbb X}$ such	that	$\mathbb{X}$	$\rightarrow$	$\mathbb{A}$
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**Task:** Find  $\mathbb{X} \to \mathbb{A}$ 

## Examples

- $\mathbb{A} = \mathbb{K}_3$ : 3-coloring problem
- $\mathbb{A} = (Z_p; \text{ affine subspaces}): \text{ solving linear equations in } \mathbb{Z}_p$
- ▲ = ({0,1};...): 3-SAT, HORN-3-SAT, NAE-3-SAT, 1-in-3-SAT

## Different questions:

- counting (solved [Bulatov'08] [Dyer,Richerby'10])
- optimization (solved [Thapper, Živný'13])
- approximation (part solved modulo UGC [Raghavendra'08])

## **Generalizations:**

- valued CSP (solved [Kolmogorov,Krokhin,Rolínek'15])
- infinite domains
- PCSP

## **Restrictions:**

- restricted inputs: planar, bounded-degree
- restricted homomorphisms: covers

# CSP and symmetry

polymorphism of  $\mathbb{A}$ : homomorphism  $f : \mathbb{A}^n \to \mathbb{A}$ 

Pol(A): the set of all polymorphisms (it is a "clone") = set of multivariable symmetries of A

**Example:**  $f(x_1, ..., x_4) = 2x_1 + 3x_2 + 3x_3 + 3x_4$  is a polymorphism of ( $Z_5$ ; affine subspaces) because affine subspaces are closed under affine combinations (note 2 + 3 + 3 + 3 + = 1)

**Example:** a projection  $f(x_1, ..., x_n) = x_i$  is always a polymorphism

**Example:**  $f(x_1, \ldots, x_n) = \alpha(x_i)$  for a bijection  $\alpha$  are the only polymorphisms of  $\mathbb{K}_3$ 

Jeavons'98: On the algebraic structure of combinatorial problems motiv.: Feder, Vardi'98: The Computational Structure of Monotone Monadic SNP...

#### Theorem

Complexity of  $CSP(\mathbb{A})$  is determined by  $Pol(\mathbb{A})$ : If  $Pol(\mathbb{A}) \subseteq Pol(\mathbb{B})$  then  $CSP(\mathbb{B})$  reduces to  $CSP(\mathbb{A})$ .

## Proof.

If  $Pol(\mathbb{A}) \subseteq Pol(\mathbb{B})$ , then relations in  $\mathbb{B}$  can be defined from relations in  $\mathbb{A}$  by a pp-formula.

[Geiger'69, Bondarčuk, Kalužnin, Kotov, Romov'69] This gives a computational reduction of  $CSP(\mathbb{B})$  to  $CSP(\mathbb{A})$ .

So: 3-coloring is NP-complete because  $\mathbb{K}_3$  has few symmetries

System of functional equations is, e.g.

$$f(g(x, y), z) = g(x, h(y, z))$$
$$m(y, x, x) = m(y, y, y)$$
$$m(x, x, y) = m(y, y, y)$$

Satisfied in  $\mathcal{M}$ , where  $\mathcal{M}$  is a set of functions: symbols can be interpreted in  $\mathcal{M}$  so that each equality is (universally) satisfied

**Example:** The above system is satisfied in  $Pol(Z_5; affine subspaces)$ 

• take 
$$f(x, y) = g(x, y) = h(x, y) = x$$

• take 
$$m(x, y, z) = x - y + z$$

Bulatov, Jeavons, Krokhin'05: Classifying the complexity of constraints using finite algebras + Bodirsky'08: PhD thesis

#### Theorem

Complexity of  $CSP(\mathbb{A})$  is determined by systems of functional equations satisfied in  $Pol(\mathbb{A})$ : If each system satisfied in  $Pol(\mathbb{A})$  is satisfied in  $Pol(\mathbb{B})$ , then  $CSP(\mathbb{B})$  reduces to  $CSP(\mathbb{A})$ .

# Proof.

Previous theorem, pp-definitions  $\rightarrow$  pp-interpretations, the HSP theorem [Birkhoff'35]

**So:** solving linear equations over  $\mathbb{Z}_5$  is in P because their template satisfies strong systems of functional equations

#### Barto, Opršal, Pinsker'18: The wonderland of reflections

minor condition = system of functional equations, each of the form symbol(variables) = symbol(variables),e.g. m(y, x, x) = m(y, y, y), m(x, x, y) = m(y, y, y)

#### Theorem

Complexity of CSP(A) determined by minor conditions satisfied in Pol(A):

If each minor condition satisfied in  $Pol(\mathbb{A})$  is satisfied in  $Pol(\mathbb{B})$ , then  $CSP(\mathbb{B})$  reduces to  $CSP(\mathbb{A})$ .

## Proof.

 $pp\text{-interpretation} \rightarrow pp\text{-construction},$  version of the HSP theorem.

# The classification result

Minor condition is trivial:

satisfied in every  $Pol(\mathbb{A})$ 

= satisfied in  $\mathcal{P}$ , the set of projections on  $\{0,1\}$ 

# Corollary

If  $Pol(\mathbb{A})$  satisfies only trivial minor conditions, then  $CSP(\mathbb{A})$  is NP-hard.

Theorem ([Bulatov'17], [Zhuk'17])

If  $Pol(\mathbb{A})$  satisfies some non-trivial minor condition, then  $CSP(\mathbb{A})$  is in P.

# Proof.

Both complex

News: the 2 approaches are closer [Barto, Bulatov, Kozik, Zhuk]

(Barto,) Bulín, Krokhin, Opršal: Algebraic approach to promise constraint satisfaction

# Definition (MinorCond( $N, \mathcal{M}$ ))

**Input:** minor condition **X** with symbols of arity *N* **Answer Yes: X** is trivial (=satisfied in  $\mathcal{P}$ ) **Answer No: X** not satisfied in  $\mathcal{M}$ 

#### Theorem

Let  $\mathcal{M} = \mathsf{Pol}(\mathbb{A})$ . The following computational problems are equivalent for a large enough N.

(i)  $CSP(\mathbb{A})$ 

(ii) MinorCond( $N, \mathcal{M}$ )

**Consequence:** 3rd step **Proof:** direct, simple, known **Note:** No  $\neq \neg$ Yes

### What can we do for NP-complete $CSP(\mathbb{A})$ ?

- Try to satisfy only some fraction of the constraints, eg. for a satisfiable 3SAT instance, find an assignment satisfying at least 90% of the clauses
- Try to satisfy a relaxed version of all constraints, eg. for a 3-colorable graph, find a 37-coloring

# Approximation and LabelCover

satisfying a fraction of constraints

## Theorem (Håstad'01)

The following problem is NP-complete for every  $\epsilon > 0$  **Input:** 3SAT instance, eg.  $(x_1 \lor \neg x_4 \lor x_3) \land (\neg x_2 \lor x_5 \lor \neg x_3) \land \dots$  **Answer Yes:** it is satisfiable **Answer No:** no  $(7/8 + \epsilon)$ -fraction of clauses is satisfiable

**Corollary:** It is NP-hard to satisfy 90% of clauses of a satisfiable 3SAT instance.

#### Proof.

Reduction from a version of the Label Cover problem (reduction uses Fourier analysis of Boolean functions.

# LaberCover(N) is CSP(A; $\langle Gr_{\phi} \rangle_{\phi:A \to A}$ ) where |A| = N and $Gr_{\phi} = \{(a, \phi(a)) : a \in [N]\}$

## Definition (GapLabelCover( $N, \epsilon$ ))

```
Input: like LaberCover(N)
Answer Yes: \phi is satisfiable
Answer No: no \epsilon-fraction of constraints is satisfiable
```

#### Theorem

For every  $\epsilon > 0$  there exists N such that GapLabelCover(N,  $\epsilon$ ) is NP-complete

**Proof**: The PCP theorem [Arora, Lund, Motwani, Sudan, Szegedy'98] Parallel Repetition Thoerem [Raz'98]

# Fun fact

## The following two problems are the same!

- MinorCond(N, P) ie. deciding whether a given minor condition is trivial
- LaberCover(N) ie. deciding whether a given label cover input is satisfiable

## Because:

interpretation of f and g by projections making the following equation true

 $f(x_3, x_1, x_1, x_2, x_1) = g(x_1, x_2, x_3, x_4, x_5)$ 

- ► corresponds to a satisfying assignment of  $Gr_{\phi}(f, g)$  where  $\phi: 1 \mapsto 3, 2, 3, 5 \mapsto 1, 4 \mapsto 2$
- under the correspondence
  - $i \leftrightarrow$  projection onto the *i*th coordinate

Remark: often implicitely used ("long code")

Input: bipartite minor condition (symbols of arity N)Answer Yes: it is trivialAnswer No:

 $(GapLabelCover(N, \epsilon))$  no  $\epsilon$ -fraction of equations is trivial (MinorCond(N, M)) not satisfied in M

- 1st is crucial problem for hardness of approximation
- 2nd is equivalent to  $CSP(\mathbb{A})$  if  $\mathcal{M} = Pol(\mathbb{A})$
- Single source of hardness (no ad-hoc reductions) 1st with ε = 1 ie. LaberCover(N) trivially reduces to every NP-complete CSP

# PCSP

# satisfying a relaxed version of all constraints

Fix 2 finite relational structures  $\mathbb{A} \to \mathbb{B}$ 

# Definition $(PCSP(\mathbb{A}, \mathbb{B}))$

Definition (search version of  $PCSP(\mathbb{A}, \mathbb{B})$ )

**Input:** X such that  $X \to A$ 

**Task:** Find  $\mathbb{X} \to \mathbb{B}$ 

(it may be a harder problem, we don't know)

**Example:**  $PCSP(\mathbb{K}_3, \mathbb{K}_4)$  is 4-coloring of a 3-colorable graph

polymorphism of  $(\mathbb{A}, \mathbb{B})$ : homomorphism  $\mathbb{A}^n \to \mathbb{B}$ 

 $\mathsf{Pol}(\mathbb{A}, \mathbb{B})$ : the set of all polymorphisms (it is a "minion") = set of multivariable symmetries of  $(\mathbb{A}, \mathbb{B})$ 

## Theorem

Let  $\mathcal{M} = \mathsf{Pol}(\mathbb{A}, \mathbb{B})$ . The following computational problems are equivalent for a large enough N.

(i)  $CSP(\mathbb{A}, \mathbb{B})$ 

(ii) MinorCond( $N, \mathcal{M}$ )

Shows that PCSP is in some sense more natural than CSP.

PCSP(K<sub>3</sub>, K<sub>4</sub>) Input: 3-colorable graph Task: find a 4-coloring

#### Conjectures

- ▶  $PCSP(\mathbb{K}_k, \mathbb{K}_l)$  NP-hard  $(l \ge k \ge 3)$ , (3,6) open
- ► Stronger: PCSP(A, B) NP-hard for any non-bipartite
- Enough to show:  $PCSP(\mathbb{C}_{odd}, \mathbb{K}_k)$  NP-hard

#### Recent hardness results:

- ► PCSP(K<sub>n</sub>, K<sub>2n-2</sub>) [Brakensiek, Guruswami'16]
- $\mathrm{PCSP}(\mathbb{K}_n, \mathbb{K}_{2n-1})$  [Bulín, Krokhin, Opršal'19]
- ►  $\operatorname{PCSP}(\mathbb{K}_n, \mathbb{K}_{\binom{n}{\lfloor n/2 \rfloor} 1}), n \ge 4$  [Wrochna, Živný'20]
- ▶  $\mathrm{PCSP}(\mathbb{C}_{\mathrm{odd}}, \mathbb{K}_3)$  [Opršal, Krokhin'19]

 $3\mathbb{NAE}_k$  ternary not-all-equal relation on a k-element set

PCSP(3NAE<sub>2</sub>, 3NAE<sub>137</sub>) Input: a 3-uniform hypergraph Answer Yes: it is 2-colorable Answer No: it is not 137-colorable

**Theorem:** It is NP-hard [Dinur,Regev,Smyth'05] (more generally  $PCSP(3NAE_l, 3NAE_k)$  NP-hard for every  $k \ge l \ge 2$ ) PCSP(1-in-3-SAT,NAE-SAT) (combinatorial formulation): Input: a 3-uniform hypergraph which has a 2-coloring such that exactly one vertex in each hyperedge receives 1 Task: find a 2-coloring

Fact: It is in P. Algorithm for finding a 2-coloring of:

- ▶ for each hyperedge {x, y, z} write x + y + z = 1
- solve the system over  $\mathbb{Q} \setminus \{\frac{1}{3}\}$  (it is solvable in  $\{0,1\}$ )
- assign  $x \mapsto 1$  iff x > 1/3

**Note:** algorithm uses infinite domain CSP **Theorem:** infinity is necessary [Barto'19]

Shows that PCSPs are algorithmically more interesting

# Hardness proofs

Label Cover and topology

# How to prove $PCSP(\mathbb{A}, \mathbb{B})$ is NP-hard

- Denote  $\mathcal{M} = \mathsf{Pol}(\mathbb{A}, \mathbb{B})$
- ▶ Strategy: Find  $\epsilon$  so that GapLabelCover $(N, \epsilon) \leq \text{MinorCond}(N, M)$  trivially

# **Input:** minor condition **M** (symbols of arity *N*) **Answer Yes:** it is trivial **Answer No:**

 $(GapLabelCover(N, \epsilon))$  no  $\epsilon$ -fraction of equations is trivial (MinorCond(N, M)) not satisfied in M

- enough: M satisfied in  $\mathcal{M}$ 
  - $\Rightarrow$  some  $\epsilon\text{-fraction}$  of equations is trivial
- ► enough: for each f ∈ M find a small (constant-size) set of "important coordinates"

if the choice behaves somewhat nicely with minors, then probabilistic argument gives us  $\Rightarrow$ 

- every  $f : \mathbb{K}_3^n \to \mathbb{K}_4$  is close to an essentially unary function:  $(\exists i) \ (\exists c \in K_4) \ (\exists \alpha) \ (\forall x \in K_3^n)$  $f(x_1, \dots, x_n) \neq c \Rightarrow f(x_1, \dots, x_n) = \alpha(x_i)$
- such an i is unique
- {i} is the small set of important coordinates

- ▶  $f : \mathbb{C}_{137}^n \to \mathbb{K}_3$  is topologically  $S^n \to S$  (S a circle)
- define  $w_i^f \in \mathbb{Z}$  for  $i \in \{1, \ldots, n\}$ 
  - ▶ fix all coordinates but *i* arbitrarily, call it  $f_i : S \to S$
  - $w_i^f$  is the winding number of  $f_i$
- behave very nicely with minors, eg. if  $g(x_1, x_2, x_3) = f(x_1, x_1, x_2, x_3)$  then  $w_1^g = w_1^f + w_2^f$
- ▶ winding number of unary *f* is bounded above by a constant *C*
- therefore  $\sum w_i \leq C$ , actually  $\sum |w_i| \leq C$
- important coordinates of f := those *i* with  $w_i^f \neq 0$

## Hardness of hypergraph coloring

- proof (now) follows the same strategy
- needs a better version of GapLabelCover
- combinatorial core to get important coordinates: high chromatic number of Kresner's graphs [Lovász'78]
- Hardness of  $PCSP(\mathbb{K}_3, \mathbb{K}_5)$ 
  - ▶ almost for free since Pol(K<sub>3</sub>, K<sub>5</sub>) satisfies less minor conditions than Pol(NAE<sub>2</sub>, NAE<sub>10000</sub>)
- ▶  $PCSP(\mathbb{K}_3, \mathbb{K}_6)$ ?
  - people mostly tried analytic approach to analyze polymorphisms

# Summary



#### Label Cover madness

- CSP (and PCSP) is equivalent to a gap version of Label Cover
- a different gap version of Label Cover crucial in the hardness proofs (both approximation and PCSP)
- in progress: intermediate problems
- PCSP algorithmically more interesting
  - $\blacktriangleright$  linear programming, linear equations over  $\mathbb Z$
  - requires infinite-domain CSP
- topology is implicitely or explicitely in most PCSP NP-hardness proofs (CSP hardness is easy)
- question: what about other kind of homomorphisms, like covers or harmonic morphisms?



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# Thank you!