

# Schaefer's theorem for graphs

Manuel Bodirsky\* and Michael Pinsker<sup>◦</sup>

\*Ecole Polytechnique, Palaiseau

◦ Université Denis Diderot - Paris 7  
Technische Universität Wien  
Hebrew University of Jerusalem

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# Outline

- The graph satisfiability problem  $\text{Graph-SAT}(\Psi)$

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- Schaefer's theorem for graphs

- The graph satisfiability problem  $\text{Graph-SAT}(\Psi)$
- $\text{Graph-SAT} \rightarrow \text{CSPs of reducts of the random graph}$
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- $\text{Graph-SAT} \rightarrow$  CSPs of reducts of the random graph
- The algebraic approach: From reducts to polymorphisms
  
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- The algebraic approach: From reducts to polymorphisms
- Ramsey theory: Patterns in polymorphisms
  
- Schaefer's theorem for graphs





# The graph satisfiability problem

## Graph-SAT( $\Psi$ )

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- A set  $W$  of propositional variables, and
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## Theorem (Schaefer '78)

Boolean-SAT( $\Psi$ ) is either in P or NP-complete, for all  $\Psi$ .

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## Question

Is Graph-SAT( $\Psi$ ) either in P or NP-complete, for all  $\Psi$ ?

# Graph-SAT: Examples

**Example 1** Let  $\Psi_1$  only contain

$$\begin{aligned}\psi_1(x, y, z) := & (E(x, y) \wedge \neg E(y, z) \wedge \neg E(x, z)) \\ & \vee (\neg E(x, y) \wedge E(y, z) \wedge \neg E(x, z)) \\ & \vee (\neg E(x, y) \wedge \neg E(y, z) \wedge E(x, z)) .\end{aligned}$$

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Graph-SAT( $\Psi_2$ ) is in P.





# Graph-SAT



## Constraint Satisfaction Problems of reducts of the random graph

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For a set  $\Psi$  of graph formulas, define a structure

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$\Gamma_\Psi$  is a *reduct* of the random graph, i.e., a structure with a first-order definition in  $G$ .

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An instance

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whether or not a given *primitive positive sentence* holds in  $\Gamma_\Psi$   
is called the *Constraint Satisfaction Problem* of  $\Gamma_\Psi$  (or CSP( $\Gamma_\Psi$ )).

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So  $\text{Graph-SAT}(\Psi)$  and  $\text{CSP}(\Gamma_\Psi)$  are one and the same problem.



The algebraic approach:  
From reducts to polymorphisms



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We write  $\text{Pol}(\Gamma)$  for the set of polymorphisms of  $\Gamma$ .

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**Theorem** (Bodirsky, Nešetřil).  $\Gamma \leq_{pp} \Delta$  iff  $\text{Pol}(\Delta) \subseteq \text{Pol}(\Gamma)$ .

# The polymorphism strategy



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Strategy:

- (i) Prove hardness for certain relations
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Reducts of (ii) have polymorphisms violating the relations of (i).



Ramsey theory:  
Patterns in polymorphisms

# Canonical functions

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Canonical functions are finite objects!



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Graph-SAT( $\Psi$ ) is either in P or NP-complete, for all  $\Psi$ .



# The theorem in more detail

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Let  $\Gamma$  be a reduct of the random graph. Then:

- Either  $\Gamma$  has one out of 17 canonical polymorphisms, and  $\text{CSP}(\Gamma)$  is tractable,
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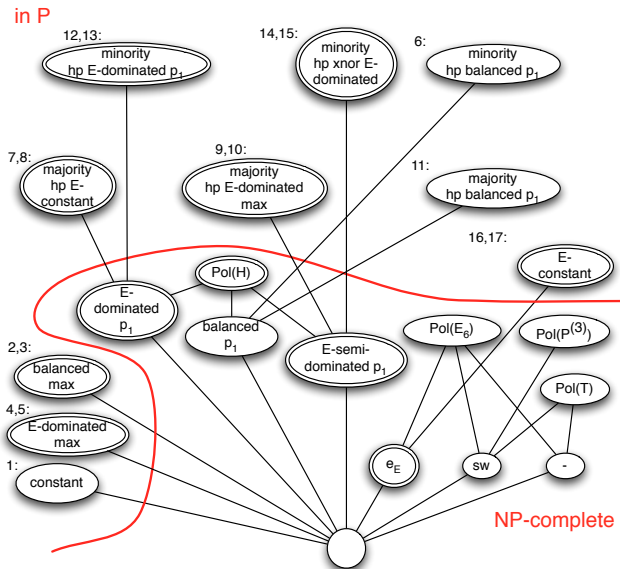
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Let  $\Gamma$  be a reduct of the random graph. Then:

- Either  $\Gamma$  pp-defines one out of 4 hard relations, and  $\text{CSP}(\Gamma)$  is NP-complete,
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# The border



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The Meta-Problem of Graph-SAT( $\Psi$ ) is decidable.

