Algorithms Transcending the SAT-Symmetry Interface

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Problem (SAT)

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Input: Boolean formula F *Output:* Is there an assignment for the variables of F such that it evaluates to **true**?

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- a disjunction $C \in F$ is called a *clause*
- an element $I \in C$ is called a *literal*





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- overhead is an issue







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• symmetries of graph are symmetries of formula (and vice versa)

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 $\begin{aligned} \varphi(F) &= \\ \{\varphi(x_1) \lor \varphi(\overline{y_1}), \varphi(x_2) \lor \varphi(\overline{y_2}), \varphi(x_3) \lor \varphi(\overline{y_3}), \varphi(x_1) \lor \varphi(x_2) \lor \varphi(x_3) \lor \varphi(z_1) \lor \varphi(z_2)\} &= \\ \{(x_2 \lor \overline{y_2}), (x_1 \lor \overline{y_1}), (x_3 \lor \overline{y_3}), (x_2 \lor x_1 \lor x_3 \lor z_1 \lor z_2)\} &= \\ \{(x_1 \lor \overline{y_1}), (x_2 \lor \overline{y_2}), (x_3 \lor \overline{y_3}), (x_1 \lor x_2 \lor x_3 \lor z_1 \lor z_2)\} &= \\ F \end{aligned}$

• bijection of vertices $\varphi: V \to V$ with $\varphi(G) = (\varphi(V), \varphi(E)) = G$

Symmetry Detection on Graphs Input: Graph G



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Problem (Symmetry Detection)

Input: Graph G Output: Generating set $S \subseteq Aut(G)$ with $\langle S \rangle = Aut(G)$





• state-of-the-art tools are nauty, saucy, bliss, Traces, dejavu

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I cheat using • I've been building the symmetry detect past 5 years randomness! • it's fast • it's fastest on SAT graphs • has one-sided bounded error (does not matter for most applications) déiavu

automorphisms.org

- I've been building the symmetry detect
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- has one-sided bounded error (does not matter for most applications)
- randomness is *inherent* to the design



Symmetry Breaking: Refined Picture



Symmetry Breaking: Refined Picture II



row interchangeability

pointwise stabilizers

orbits

disjoint decomposition

• structural analysis of permutation group

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- enable efficient production of symmetry breaking clauses

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Relies on "transpositions":

 $S_1 = \{(12), (23), (34)\}$

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 $egin{aligned} S_2 &= \{ (12), (1234) \} \ \langle S_1
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BreakID on PHP instances



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symmetry detection

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Schreier-Sims







row interchangeability	pointwise stabilizers	orbits	disjoint decomposition
no algorithm	Schreier-Sims	well-known algorithm	recent [Chang, Jefferson, '20]









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- So... also not *quite* what we want?

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A graph G and generating S is called a joint graph-group pair, whenever $\langle S \rangle = Aut(G)$.

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Given a SAT formula F, graph G = (V, E), we call algorithms that run in time $\mathcal{O}(|F| + |V| + |E| + \operatorname{enc}(S))$ instance-linear, where $\operatorname{enc}(S) := \sum_{p \in S} |\operatorname{supp}(p)|$.

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Are there better algorithms or heuristics in this setting? Yes!

Symmetry Breaking: Refined Picture III



orbit \equiv

natural symmetric action

pointwise stabilizers

orbits

disjoint decomposition





• finest disjoint decomposition in instance-quasi-linear time (instance-linear if orbits available)



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Finest Disjoint Direct Decomposition: Algorithm

• color vertices with "orbits", connect vertices of orbit with a path



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Ilip edges between colors


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- Finest Disjoint Direct Decomposition: Algorithm
 - Color vertices with "orbits", connect vertices of orbit with a path

elip edges between colors

3 compute connected components





• color vertices with "orbits", connect vertices of orbit with a path





Lemma

Vertices are in the same connected component if and only if they are in the same factor of the finest direct disjoint decomposition.





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work to do to put this in practice (no 1:1 replacement for heuristics!)



- make use of joint graph-group pairs to get fast, generic algorithms and heuristics
- work to do to put this in practice (no 1:1 replacement for heuristics!)
- want to detect more involved group structures