

# Certified Static and Dynamic Symmetry Breaking

**Bart Bogaerts**

(Thanks to co-conspirators Jo Devriendt, Ward Gauderis,  
Stephan Gocht, Ciaran McCreesh, Jakob Nordström)

*Vrije Universiteit Brussel*

Satisfiability: Theory, Practice, and Beyond  
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Consider the formula  $F$ :

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( $F \upharpoonright_{\sigma}$  is replacing each  $x$  by  $\sigma(x)$  in  $F$ )
- ▶ Symmetric problems are often **problematic** for vanilla CDCL solvers (insert obligatory reference to PH principle here)

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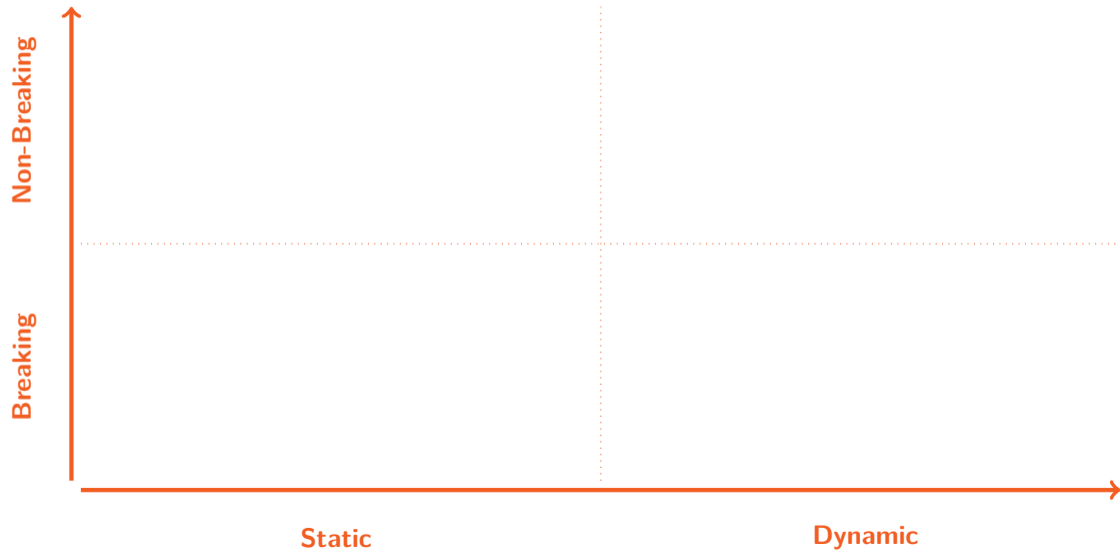
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# OUTLINE OF THIS TALK

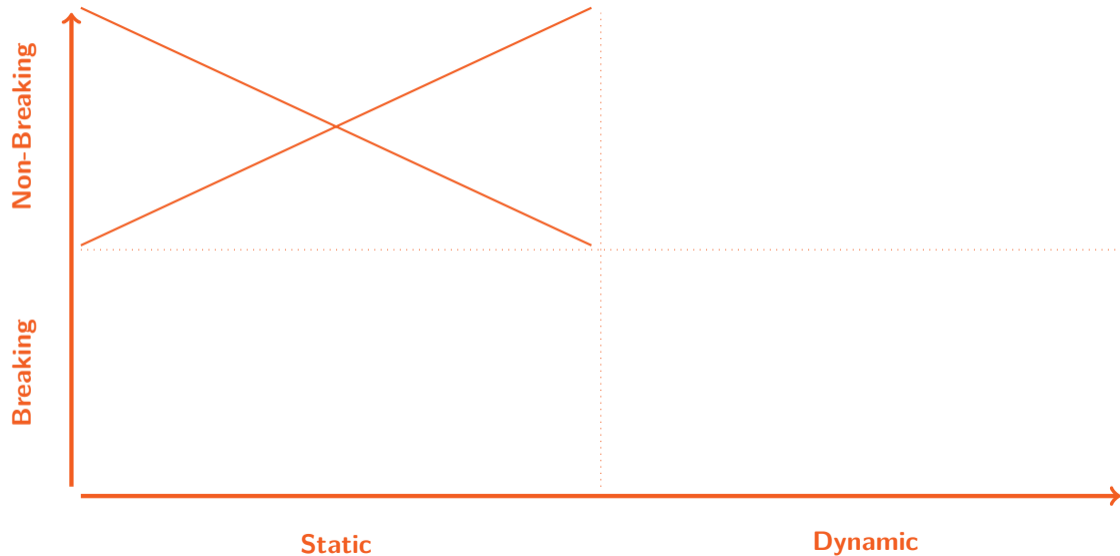
1. Introduction
2. Handling Symmetries in SAT (Overview)
3. Symmetry Breaking with VeriPB
  1. The VeriPB proof System
  2. VeriPB-certified symmetry breaking
4. Conclusion

## SYMMETRY HANDLING TECHNIQUES

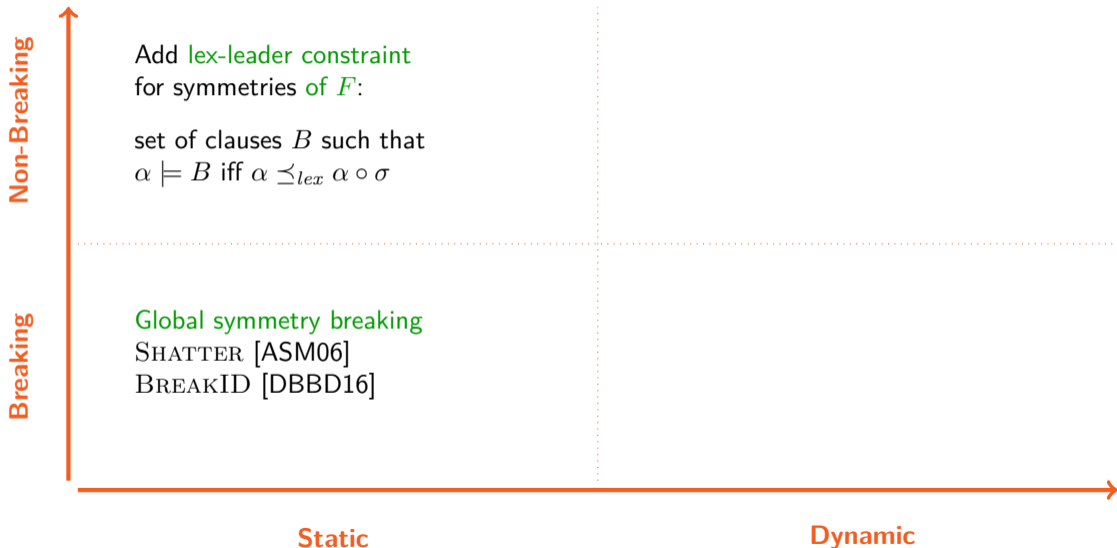




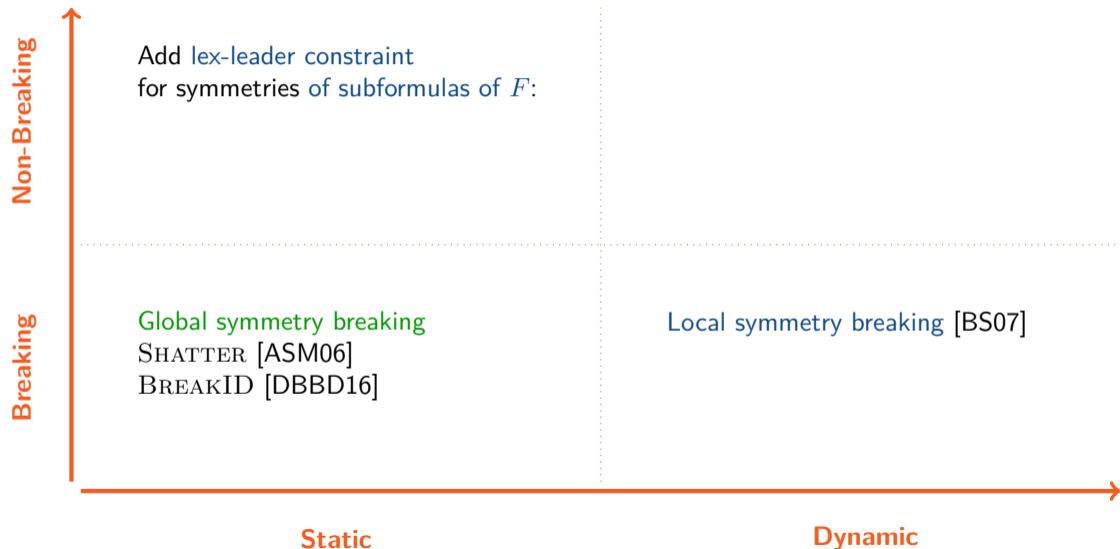
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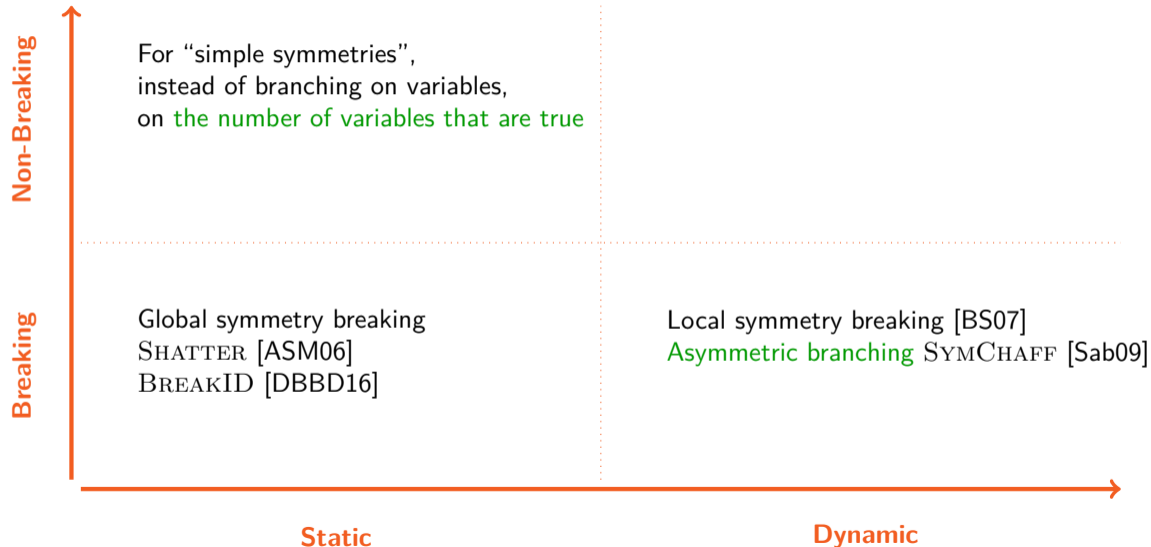
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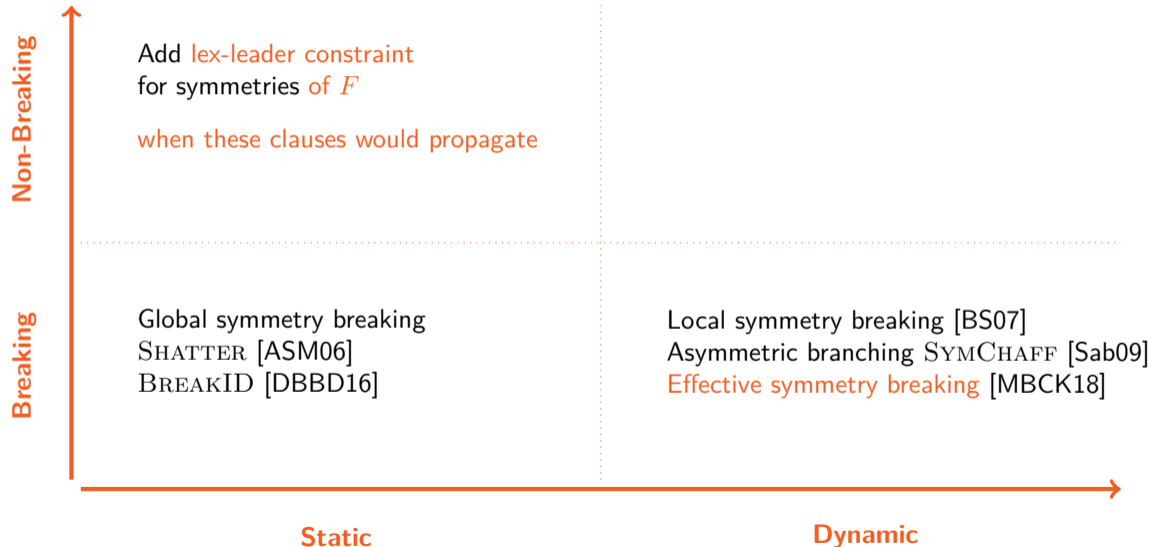
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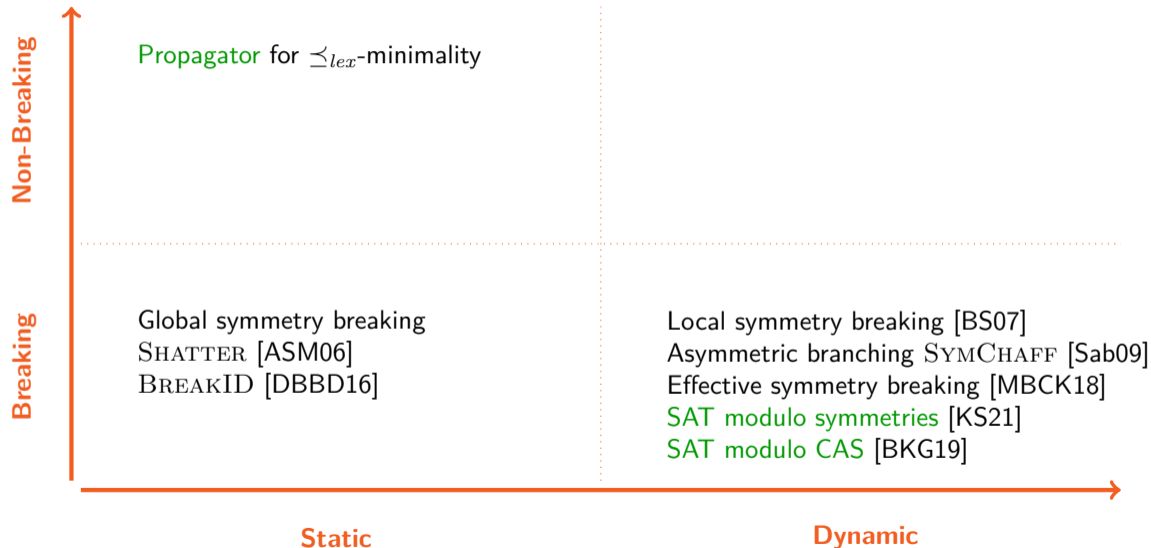
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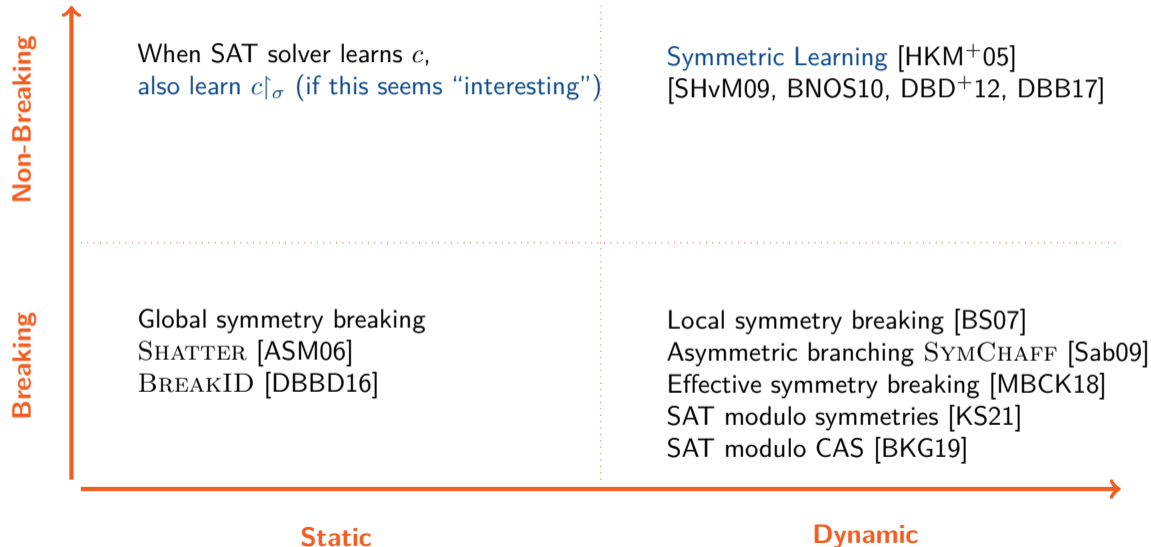
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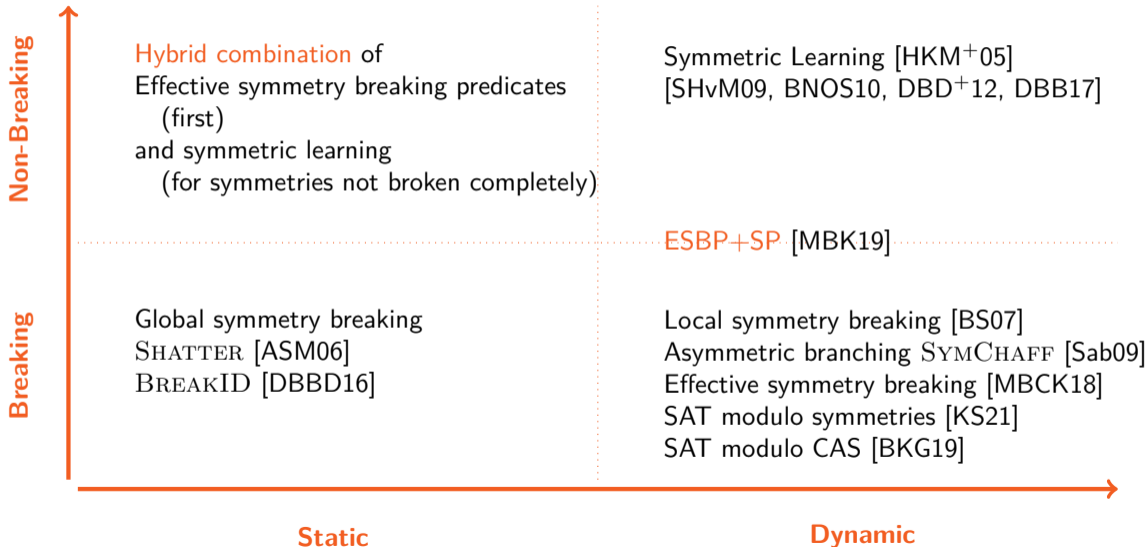
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## Symmetric learning

- ▶ Recently proposed proof logging [TD20]
  1. Special-purpose, specific approach
  2. Requires adding explicit concept of symmetries
  3. Not compatible with preprocessing techniques

Better to keep proof system super-simple(?)

# THE VERIPB PROOF SYSTEM

A proof system for **pseudo-Boolean optimization problems**

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Details about the proof checker, see Stephan Gocht's PhD thesis [Goc22]

# PSEUDO-BOOLEAN CONSTRAINTS

Pseudo-Boolean constraints are 0-1 integer linear constraints

$$\sum_i a_i l_i \geq A$$

- ▶  $a_i, A \in \mathbb{Z}$
- ▶ **literals**  $l_i$ :  $x_i$  or  $\bar{x}_i$  (where  $x_i + \bar{x}_i = 1$ )
- ▶ as before, variables  $x_i$  take values  $0 = \text{false}$  or  $1 = \text{true}$



## PSEUDO-BOOLEAN REASONING: CUTTING PLANES [CCT87]

**Literal axioms**  $\frac{}{l_i \geq 0}$

**Linear combination**  $\frac{\sum_i a_i l_i \geq A \quad \sum_i b_i l_i \geq B}{\sum_i (c_A a_i + c_B b_i) l_i \geq c_A A + c_B B} \quad [c_A, c_B \in \mathbb{N}]$

**Division**  $\frac{\sum_i c a_i l_i \geq A}{\sum_i a_i l_i \geq \lceil A/c \rceil} \quad [c \in \mathbb{N}^+]$

## REDUNDANCE-BASED STRENGTHENING

- ▶  $C$  is **redundant** with respect to  $F$  if  $F$  and  $F \wedge C$  are **equisatisfiable**
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$C$  is redundant with respect to  $F$  if and only if there is a substitution  $\omega$  (mapping variables to truth values or literals), called a **witness**, for which

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- ▶ Proof sketch for interesting direction: If  $\alpha$  satisfies  $F$  but falsifies  $C$ , then  $\alpha \circ \omega$  satisfies  $F \wedge C$
- ▶ Implication should be efficiently verifiable (which is the case, e.g., if all constraints in  $(F \wedge C) \upharpoonright_{\omega}$  are RUP)

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### Spoiler alert:

For decision problem, nothing stops us from inventing objective function (like lexicographic order  $\sum_{i=1}^n 2^i \cdot x_i$ )

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6. Otherwise  $((\alpha \circ \omega) \circ \omega) \circ \omega$  satisfies  $F$  and  $f(((\alpha \circ \omega) \circ \omega) \circ \omega) < f((\alpha \circ \omega) \circ \omega)$
7. ...
8. Can't go on forever, so finally reach  $\alpha'$  satisfying  $F \wedge D$

## STRENGTH OF DOMINANCE RULE

### Dominance-based strengthening (stronger, still simplified) [BGMN22]

If  $D_1, D_2, \dots, D_{m-1}$  have been derived from  $F$  (maybe using dominance), then can derive also  $D_m$  if exists witness substitution  $\omega$  such that

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## STRATEGY FOR SAT SYMMETRY BREAKING

1. Pretend to solve optimisation problem minimizing  $f \doteq \sum_{i=1}^n 2^{n-i} \cdot x_i$   
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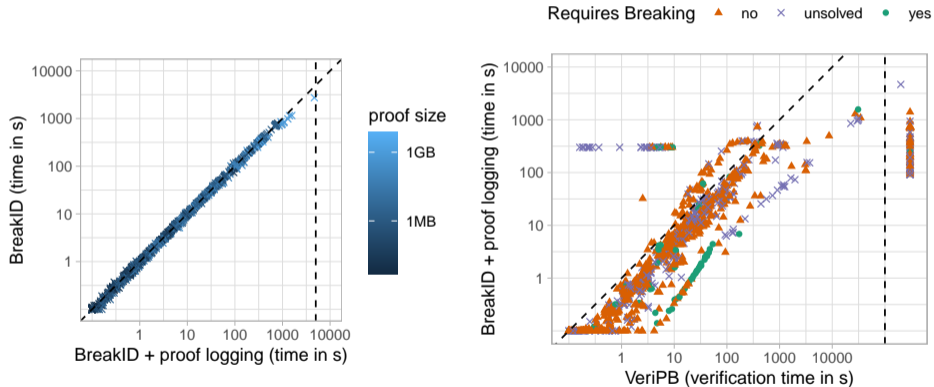
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$$\begin{array}{ll}
 y_0 & \bar{y}_j \vee \overline{\sigma(x_j)} \vee x_j \\
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# EXPERIMENTAL EVALUATION

- ▶ Evaluated on SAT competition benchmarks
- ▶ BREAKID [DBBD16, Bre] used to find and break symmetries



- ▶ proof logging overhead negligible
- ▶ verification at most 20 times slower than solving for 95% of instances

# BREAKING SYMMETRIES WITH THE DOMINANCE RULE (1/2)

## Definition

Given a symmetry  $\sigma$ , the (pseudo-Boolean) breaking constraint of  $\sigma$  is

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## Theorem

$C_\sigma$  can be derived from  $F$  using dominance with witness  $\sigma$

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Why does it work?

- ▶ Witness need not satisfy all derived constraints
- ▶ Sufficient to just produce “better” assignment

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Thank you for your attention!

## SYMMETRY BREAKING: EXAMPLE

## Example (Pigeonhole principle formula)

- ▶ Variables  $p_{ij}$  ( $1 \leq i \leq 4, 1 \leq j \leq 3$ ) true iff pigeon  $i$  in hole  $j$
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Order: “Pigeon 1 preferred in the largest possible hole; next pigeon 2, ...”

$$f \doteq 2^{11} \cdot p_{13} + 2^{10} \cdot p_{12} + 2^9 \cdot p_{11} + 2^8 \cdot p_{23} + \cdots + 1 \cdot p_{41}$$

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Similar to DRAT symmetry breaking [HHW15]

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*This idea does not generalize.*

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If it is falsified, we can “restore” its truth by applying  $\sigma_{(1234)}$  **once**, **twice**, or **thrice**.

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(derivable with redundance rule) If  $y_k$  is true,  $x_k$  is at most  $\sigma(x_k)$

(derivable from the PB breaking constraint)

## DETAILED DERIVATION OF CNF BREAKING CONSTRAINTS

Derived constraints ( $D$ ):

Pseudo-Boolean breaking constraint

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Derived constraints ( $D$ ):

$$\sum_{i=1}^n 2^{n-i} \cdot (\sigma(x_i) - x_i) \geq 0$$

$y_0$

$$\bar{y}_0 \vee \bar{x}_1 \vee \sigma(x_1)$$

Derivable by RUP

$$\begin{aligned} F \wedge D \wedge \neg(\bar{y}_0 \vee \bar{x}_1 \vee \sigma(x_1)) \\ = F \wedge D \wedge \{y_0 \wedge x_1 \wedge \overline{\sigma(x_1)}\} \end{aligned}$$

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$$\sum_{i=1}^n 2^{n-i} \cdot (\sigma(x_i) - x_i) \geq 0$$

$$2^{n-1} \cdot (-1) + \sum_{i=2}^n 2^{n-i} \cdot (\sigma(x_i) - x_i) \geq 0$$

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with

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Derivable by **redundance** with witness  $\omega : y_1 \mapsto 0$

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$$\models (F \wedge D) \upharpoonright_{\omega} \wedge \{y_1 \vee \bar{y}_0 \vee \bar{x}_1\} \upharpoonright_{\omega}$$

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The clause to derive is **RUP** wrt this constraint

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