#### Symmetry Propagation

Jo Devriendt
Bart Bogaerts
Broes De Cat
Marc
Denecker,
Christopher
Mears

Background

Algorithm

Optimisatio

Results

# Symmetry Propagation Improved Dynamic Symmetry Breaking in SAT

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

KU Leuven and Monash University

SymCon'12

#### Outline

#### Symmetry Propagation

Bart Bogaert Broes De Ca Marc Denecker, Christopher Mears

Background

Algorithm

Ontimicati

Poculto

1 Background

2 Algorithm

3 Optimisations

#### SAT

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher

#### Background

Aigoritiiii

Optimisations

Result

#### ■ SAT theory: conjunction of clauses

• e.g. 
$$T = (a \lor b \lor c) \land (d \lor e) \land \dots$$

• (or 
$$T = \{a, b, c\} \land \{d, e\} \land ...$$
)

- Assignment  $\alpha$ : set of literals currently true
  - e.g.  $\alpha = \{a, \neg b, \neg e, d, g\}$
- Decision literals  $\delta \subseteq \alpha$ : choices made by search
  - e.g.  $\delta = \{a, \neg e\}$
- **E**xplanations: why is  $\ell \in \alpha$ ?
  - =  $expl(\ell) = clause$
  - e.g.  $expl(d) = \{d, e\}$
  - Only for propagated literals (those in  $\alpha \setminus \delta$ )

### **Symmetries**

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

#### ${\sf Background}$

Ориннация

Results

lacksquare A **symmetry** of T is a permutation on the literals of T...

• e.g. 
$$\sigma = (ab \neg c)(de)$$

- ... that satisfies these conditions:
  - $\bullet$   $\sigma(\alpha)$  is a model of  $T \Leftrightarrow \alpha$  is a model of T
  - $\sigma(\neg \ell) = \neg \sigma(\ell)$
- Symmetries lift naturally to clauses and theories.

### **Symmetries**

### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

#### ${\sf Background}$

Algorithm

Optimisatio

Populto

- If S is the symmetry group of theory T, and T entails the clause  $\alpha \to \ell$ , then T also entails the clause  $\sigma(\alpha) \to \sigma(\ell)$ .
- There are many such  $\sigma(\alpha) \to \sigma(\ell)$  clauses (too many!)
- We use a **weak activity** heuristic to detect useful  $\sigma(\alpha) \to \sigma(\ell)$  clauses: ones that propagate.

### Activity

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

#### ${\sf Background}$

Algorithm

Optimisation

Result

#### **Symmetry** $\sigma$ is **active** under $\alpha$ if:

- $\sigma(\alpha) = \alpha$
- During search:
  - lacksquare  $\alpha$  is the set of true literals,
  - ullet  $\delta\subseteq lpha$  is the set of search decisions.
- **Symmetry**  $\sigma$  is **weakly active** for  $\delta$  under  $\alpha$  if:
  - $\sigma(\delta) \subseteq \alpha$
- **Asymmetric** literal: literal  $\ell \in \alpha$  where  $\sigma(\ell) \notin \alpha$ 
  - $\bullet$  ( $\sigma$  is not active, but might be weakly active)

#### Overview

```
Symmetry
Propagation
```

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Backgroun

Algorithm

Optimisation:

```
Results
```

```
repeat
   while there is a unit clause do
        run unit propagation
   end while
   for each weakly active symmetry \sigma in S do
        if there is an asymmetric literal \ell for \sigma then
            add \sigma(\ell) to \alpha
            define expl(\sigma(\ell)) = \sigma(expl(\ell))
            add expl(\sigma(\ell)) to T
            break and go back to unit propagation
        end if
   end for
until conflict, or no new literals propagated
```

Symmetry Propagation

Jo Devriendt Bart Bogaert: Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

Optimisatio

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \emptyset$$

$$\delta = \emptyset$$

#### Symmetry Propagation

Jo Devriendt Bart Bogaert: Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

Reculte

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a\}$$

$$\delta = \{a\}$$

Search chooses a

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher

Backgroun

Algorithm

Optimisatio

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, \mathbf{d}\}$$

$$\delta = \{a\}$$

- Unit propagation infers d
- lacksquare  $\sigma$  is not weakly active (because  $\sigma(\delta) \not\subseteq \alpha$ )
- a is first asymmetric literal for  $\sigma$  (because  $\sigma(a) \notin \alpha$ )

Symmetry Propagation

Jo Devriendt Bart Bogaerts Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

O-+:--:--

Results

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, d, \mathbf{f}\}$$

$$\delta = \{a, \mathbf{f}\}$$

Search chooses f

#### Symmetry Propagation

Jo Devriendt Bart Bogaert: Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

Ŭ

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, d, f, \mathbf{b}\}$$

$$\delta = \{a, f\}$$

Unit propagation infers b

#### Symmetry Propagation

Jo Devriendt Bart Bogaerts Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

Optimisatio

Doculto

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\} \}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, d, f, b\}$$

$$\delta = \{a, f\}$$

- lacksquare  $\sigma$  is now weakly active (but not active)
- lacksquare First asymmetric literal for  $\sigma$  is now d

Symmetry Propagation

Algorithm

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, d, f, b, e\}$$

$$\delta = \{a, f\}$$

- $\sigma$  is now weakly active (but not active)
- **First asymmetric literal for**  $\sigma$  **is now** d
- Symmetric propagation infers  $\sigma(d)$ , which is e
- $\bullet$  expl(e) =  $\sigma(\exp(d)) = {\neg b, e}$

Symmetry Propagation

Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher

Backgroun

Algorithm

Optimisation

Doculto

$$T = \{\neg f, a\} \land \{\neg f, b\} \land \{\neg a, d\} \land \{\neg b, e, c\} \land \{\neg c, \neg g\}, \{\neg c, g\} \}$$

$$S = \{\sigma\} = \{(ab)(de)\}$$

$$\alpha = \{a, d, f, b, e\}$$

$$\delta = \{a, f\}$$

- Unit propagation resumes (but nothing to do)
- lacksquare  $\sigma$  is still weakly active
- No more asymmetric literals in  $\alpha$  ( $\sigma$  is active)
- Search continues

### Tracking weak activity

Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background Algorithm

оринначини

- Symmetry  $\sigma$  is weakly active if  $\sigma(\delta) \subseteq \alpha$ .
- Each symmetry has a counter, initialised to zero.
- When a literal  $\ell$  is added to  $\alpha$ , for each symmetry  $\sigma$ :
  - if  $\ell \in \delta$  and  $\sigma(\ell) \notin \alpha$ , increment counter
  - if  $\sigma^{-1}(\ell) \in \delta$ , decrement counter
- Symmetry is weakly active if counter is zero.
- **Constant time per symmetry that involves**  $\ell$ .

#### **Properties**

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts Broes De Cat, Marc Denecker, Christopher Mears

Background

Algorithm

Optimisations

- Symmetry propagation preserves completeness (never loops infinitely).
- Symmetry propagation preserves soundness, and does not choose solutions a priori.
- Choosing a choice literal can decrease or increase the set of weakly active symmetries.
- Propagating a literal only increases the set of weakly active symmetries.
- After propagation, all weakly active symmetries are active again
  - i.e. for all weakly active symmetries  $\sigma$  we have  $\sigma(\alpha) = \alpha$

### Optimisation 1: Inverting Symmetries

### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

Optimisations

- An symmetry  $\sigma$  is *inverting* if  $\sigma(\ell) = \neg \ell$  for some  $\ell$ .
  - Such a literal  $\ell$  is *inverting* for  $\sigma$ .
- When an inverting literal  $\ell$  is propagated, symmetry propagation will cause  $\sigma(\ell) = \neg \ell$  to be propagated, causing a conflict.
- When an inverting literal  $\ell$  becomes a decision literal, then  $\sigma$  will become weakly inactive *permanently* (until backtracking undoes the choice of  $\ell$ ).
- Optimisation: make the search avoid choosing inverting literals as its decisions.

### Optimisation 2: Inactive propagation

Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

Algorithm

Optimisations

- Symmetry propagation is about finding implied unit clauses.
  - We find an explanation clause c such that weak activity guarantees  $\sigma(c)$  is unit.
- In addition: generate clauses from existing explanations and weakly inactive symmetries and propagate with them if they are unit.

```
\begin{array}{l} \textbf{for each literal } \ell \in \alpha \setminus \delta \ \textbf{do} \\ \textbf{for each weakly inactive symmetry } \sigma \ \textbf{do} \\ \textbf{if } \sigma(expl(\ell)) \ \text{is unit then} \\ \textbf{Propagate with it and resume unit propagation} \\ \textbf{end if} \\ \textbf{end for} \\ \textbf{end for} \end{array}
```

#### Results Overview

#### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

. . . .

Results

 Compared Minisat, Minisat+Shatter, Minisat+SP, Minisat+SP+optimisations.

- Symmetric problems from SAT2011 competition and standard symmetric benchmarks.
- On satisfiable problems:
  - All methods work well.
  - Minisat+Shatter best.
- On unsatisfiable problems:
  - Symmetry breaking much more important.
  - Minisat+SP+optimisations best.

#### Results Examples

### Symmetry Propagation

Jo Devriendt, Bart Bogaerts Broes De Cat Marc Denecker, Christopher Mears

Backgroun

Algorithm

Optimisation

Results

#### ■ Satisfiable problem

	Solve Time (s)				
Problem name	Minisat	+SP <sup>reg</sup>	+SP <sup>opt</sup>	+Shatter	
battleship-07-13-sat	0.0	0.4	0.4	0.4	
battleship-08-15-sat	0.0	0.0	0.0	0.0	
battleship-09-17-sat	0.0	0.1	0.1	0.1	
battleship-10-17-sat	3.9	1.4	2.2	5.4	
battleship-10-18-sat	0.0	0.0	0.1	0.1	
battleship-10-19-sat	0.0	0.1	0.1	0.1	
battleship-12-23-sat	0.0	0.1	0.1	0.1	
battleship-14-26-sat	718.2	1060.2	546.1	14.3	
battleship-15-29-sat	386.0	16.5	296.6	88.1	
battleship-24-57-sat	16.5	2.8	21.9	34.3	

### Results Examples

### Symmetry Propagation

Jo Devriendt, Bart Bogaerts Broes De Cat, Marc Denecker, Christopher Mears

Backgroun

Algorithm

Optimisation

 ${\sf Results}$ 

#### Unsatisfiable problem

	Solve Time (s)			
Problem name	Minisat	+SP <sup>reg</sup>	+SP <sup>opt</sup>	+Shatter
battleship-05-08-uns	0.0	0.0	0.0	0.0
battleship-06-09-uns	0.1	0.0	0.0	0.0
battleship-07-12-uns	485.1	17.3	2.0	1.4
battleship-10-10-uns	1.6	1.1	0.2	0.0
battleship-12-12-uns	402.3	45.6	0.7	1.3
battleship-14-14-uns	-	-	1372.2	736.6
battleship-15-15-uns	-	-	149.0	-
battleship-16-16-uns	-	-	32.9	-

### Results Examples

Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

Algorithm

Optimisation

Results

■ Inverting Literals

	Solve Time (s)				
Problem name	Minisat	+SP <sup>reg</sup>	+SP <sup>opt</sup>	+Shatter	
Urq3_5-uns	139.7	0.0	0.0	0.1	
Urq4_5-uns	-	0.0	0.0	39.0	
Urq5_5-uns	-	7.0	0.2	3810.3	
Urq6_5-uns	-	-	0.6	-	
Urq7_5-uns	-	-	1.3	-	
Urq8_5-uns	-	-	3.3	-	

#### Conclusions and Future Directions

### Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

Algorithm

Optimisation Results

New approach to dynamic symmetry breaking

■ Better than existing methods on unsatisfiable instances

- Application to general constraint programming
- Search heuristics to maximise weakly active constraints

### Thank you!

Symmetry Propagation

Jo Devriendt, Bart Bogaerts, Broes De Cat, Marc Denecker, Christopher Mears

Background

Algorithm

Optimisation

Results

## Questions?