

# **Sat-Solving Based on Boundary Point Elimination**

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# Outline

- Introduction
- BPE-SAT
- Experimental results and conclusions

# Motivation

Conflict Driven SAT-solvers with Clause Learning (CDCL-solvers) dominate the world of SAT-algorithms

However, they are still unrobust and unscalable (even for formulas with small proofs)

**One of the main reasons:** CDCL SAT-solvers do not take into account the formula structure (some success with using formula symmetry).

# Resolution as Boundary Point (BP) Elimination

BP  $p$  of  $F$  is a special kind of a complete assignment

$F$  has no BPs  $\Rightarrow F \equiv 0$

A BP  $p$  of  $F$  mandates a resolution (with resolvent  $C$ ) such that :  $p$  is not a BP of  $F \wedge C$

A resolution proof of  $F \equiv 0$  can be viewed as a **process of BP elimination**

# Completeness of Resolution Based on BP Elimination

Proof system based on elimination of BPs of the **original formula**  $F$  is, in general, **incomplete**:

One cannot always find a proof where every resolvent  $R_{k+1}$  eliminates a BP of  $F \wedge R_1 \wedge \dots \wedge R_k$

**A complete proof system:** every resolvent  $R_{k+1}$  has to eliminate **only** a BP of an **unsatisfiable subformula** of  $F \wedge R_1 \wedge \dots \wedge R_k$  (to be published)

Here, we consider the first case. Our approach can be extended to the second case too.

# BP Elimination and Formula Structure

To find a **short** resolution proof a SAT-solver needs to find mandatory resolutions as soon as possible.

Finding a BP of the entire formula  $F$  is computationally hard.

**An idea:** find subformulas  $F'$  such that BPs of  $F'$  are also BPs of  $F$ .

Formula structure  $\Leftrightarrow$  Knowledge of subformulas  $F'$  sharing BPs with  $F$

# BPE-SAT

- BPE-SAT is a template of resolution SAT-solvers.
- The main idea is to derive an empty clause from  $F$  by resolutions eliminating BPs of  $F$
- BPs of  $F$  are eliminated by eliminating BPs of subformulas  $F'$ .

We conjecture that an efficient resolution SAT-solver has to be an implementation of BPE-SAT.

We show that a CDCL SAT-solver is a particular implementation BPE-SAT (and it is not always the best)

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# Boundary Point (definition)

$F$  – CNF formula,  $\mathbf{p}$  – complete assignment,  $l$  is  $x$  or  $\sim x$

$\mathbf{p}$  is  $l$ -BP of  $F$  if  $F(\mathbf{p})=0$  and  
For all  $C \in F$ ,  $C(\mathbf{p}) = 0 \Rightarrow l \in C$

$\mathbf{p}'' = \text{flip}(\mathbf{p}', x)$

$\mathbf{p}'$  is  $l$ -BP of  $F \Rightarrow$   
 $\mathbf{p}''$  is  $\sim l$ -BP of  $F$  or  $F(\mathbf{p}'') = 1$

Elimination of  $\mathbf{p}', \mathbf{p}'' = \text{flip}(\mathbf{p}', x)$  :

Find  $C'(\mathbf{p}')=0$  and  $C''(\mathbf{p}'')=0$

Add resolvent  $C$  of  $C', C''$  on  $x$  to  $F$

# Mandatory Resolutions

Let  $F$  be unsatisfiable and  $l$  be a literal of  $x$ .

- All BPs of  $F$  must be eliminated in a resolution proof
- An  $l$ -BP  $p$  of  $F$  is eliminated only by a resolution on variable  $x$  such that  $C(p)=0$  where  $C$  is the resolvent

An  $l$ -BP **mandates** a particular resolution on  $x$

**Idea:** use BPs to drive resolution proofs

# A Key Point of BPE-SAT

Finding  $\perp$ -BP of  $F \Rightarrow$  SAT-check for  $F \setminus \{\text{Clauses with } \perp\}$   
Generally, this is expensive

Idea: Eliminate  $\perp$ -BPs of *subformulas* of  $F$

$\mathbf{p}$  is  $\perp$ -BP of  $F \Rightarrow$

$\mathbf{p}$  is  $\perp$ -BP of any subformula  $F'$  of  $F$ , s.t.  $F'(\mathbf{p})=0$

It is a conservative approach:

BPs eliminated from  $F'$  are not necessarily BPs of  $F$

# High-Level View of BPE-SAT

```
BPE-SAT(F)  
  { while (true)  
    {  $F'(X, Y) = \text{Pick\_subformula}(F)$ ;  
       $R(Y) = \text{Elim\_vars}(F'(X, Y))$ ;  
      if ( $\text{empty\_clause} \in R$ ) return(Unsat);  
       $F = F \cup R$ ; } }
```

- *Elim\_vars* quantifies away variables of  $X$
- **To existentially quantify away  $x \in X$  from  $F'$ :**  
 $F' \Rightarrow F' \setminus \{\text{clauses of with } x\} \cup S$ ,  
 $S$  eliminates all removable  $x$ -BPs,  $\sim x$ -BPs of  $F'$

# BPE-SAT and CDCL Sat-Solvers

A CDCL SAT-solver is a special case of BPE-SAT

- Clauses responsible for a conflict  $\Rightarrow$  subformula  $F'$
- Conflict clause generation  $\Rightarrow$  elimination of BPs of  $F'$
- Eliminated BPs are trivially obtained from the assignment leading to the conflict

BPE paradigm provides explanation of why SAT-solvers based on DPLL are dominant.

# A Flaw of CDCL SAT-Solvers

- Conflicts can not be controlled
- So subformulas  $F'$  corresponding to conflicts are “accidental”

BP's of  $F'$  eliminated by resolutions used to generate a conflict clause may not eliminate any BP's of  $F$

- Let  $p$  be a BP of  $F'$  eliminated by resolving clauses of  $F'$  on  $x$
- $p$  may be falsified by a clause of  $F \setminus F'$  that does not have variable  $x$

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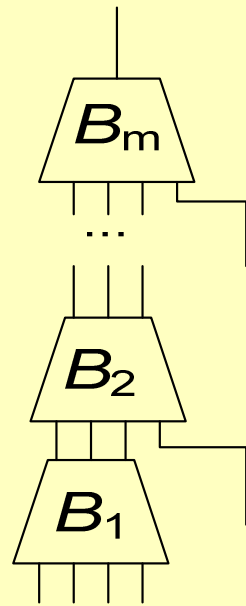
# Low Quality Proofs of a CDCL Sat-Solver

Solving formulas describing self-equivalence of  $n$ -bit multipliers

#bits	Picosat		Specialized proofs	
	#resolutions	mand. res. %	#resolutions	mand. res. %
2	215	77	77	100
3	2,958	66	409	100
4	32,117	38	957	100
5	231,270	24	1,697	100

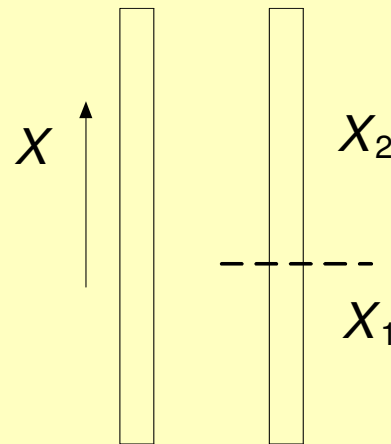


# Narrow Formulas $F(r,m)$



$N(r,m), r = 3$

$F(r,m)$  describes equivalence checking of two implementations of  $N(r,m)$ .



$F'$  consists of the clauses of  $F$  with at least one variable from  $X_1$

elimination of BPs of  $F' \Rightarrow$  elimination of BPs of  $F$

# Comparison of BPE-SAT and CDCL SAT-Solvers

Solving formulas  $F(r,m)$ . Time limit is 300,000 seconds.

$(r,m)$	$(vars, cls) \times 10^3$	<i>picosat</i> (s.)	<i>bpe-sat</i> (s.)	<i>ratio pico / bpe</i>
(3, 300)	(11, 30)	2.3	6.4	0.4
(3, 1000)	(35, 100)	69.6	30.8	2.2
(3, 2000)	(70, 200)	162	88.0	1.8
(4, 200)	(29, 86)	548	58.7	9.3
(4, 600)	(88, 258)	99,820	235	425
(4, 1000)	(147, 430)	<b>timeout</b>	955	> 314

# Conclusions

- We formulate BPE-SAT, a template of resolution based SAT-solvers
- It is based on very general implications of the BP elimination concept
- CDCL SAT-solvers are a particular implementation of BPE-SAT
- We show the importance of knowing the formula structure (defined as subformulas sharing BPs with the formula)