



# Generalized Boolean Satisfiability

## ZAP II: Theory

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Knowledge Representation and  
Reasoning

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# Outline

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- Motivation and Intuition
- Group Theory Background
- Augmented Resolution
- Proof lengths of our examples
- DPLL in the new setting
- Experimental results
- Summary
- Discussion



# Motivation

	rep. eff.	p-simulation hierarchy	inference	unit propagation	learning
SAT	1	EEE	resolution	watched literals	relevance
cardinality	exp	P?E	not unique	watched literals	relevance
PB	exp	P?E	unique	watched literals	+ strengthening
symmetry	1	EEE*	not in P	same as SAT	same as SAT
QPROP	exp	???	in P using reasons	exp improvement	+ first-order

- None admits a poly-sized proof for clique colouring
- Is there a representation such that:
  1. Exponential savings in size of representation
  2. Poly-size proofs of the 3 problems exist
  3. DPLL is still efficient

Yes!



# Intuition – Pigeon Hole

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- “no two pigeons are in the same hole”:

$$\neg p_{ik} \vee \neg p_{jk} \quad \forall i \neq j, k$$

- One axiom represents  $\binom{n}{2}n$  clauses
- Generate other clauses by permuting the literals



# Intuition – Parity Axioms

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$$x_1 + x_2 + x_3 \equiv 1 \pmod{2}$$

equivalent to the 4 clauses

$$x_1 \vee x_2 \vee x_3$$

$$\neg x_1 \vee x_2 \vee \neg x_3$$

$$x_1 \vee \neg x_2 \vee \neg x_3$$

$$\neg x_1 \vee \neg x_2 \vee x_3$$

How can the other three clauses be generated from the first using permutations?



# Intuition – Parity Axioms cont.

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1.  $X_1 \vee X_2 \vee X_3$
2.  $X_1 \vee \neg X_2 \vee \neg X_3$
3.  $\neg X_1 \vee X_2 \vee \neg X_3$
4.  $\neg X_1 \vee \neg X_2 \vee X_3$

Permutations:

1  $\rightarrow$  1:  $()$

1  $\rightarrow$  2:  $(X_2 \neg X_2)(X_3 \neg X_3)$

1  $\rightarrow$  3:  $(X_1 \neg X_1)(X_3 \neg X_3)$

1  $\rightarrow$  4:  $(X_1 \neg X_1)(X_2 \neg X_2)$



# Permutation Set Properties

- Set of permutations for the parity clause:

$$S = \{(), (x_2 \neg x_2)(x_3 \neg x_3), (x_1 \neg x_1)(x_3 \neg x_3), (x_1 \neg x_1)(x_2 \neg x_2)\}$$

- Compose elements of S:

$$(x_2 \neg x_2)(x_3 \neg x_3) (x_1 \neg x_1)(x_3 \neg x_3) = (x_1 \neg x_1)(x_2 \neg x_2)$$

$$(x_2 \neg x_2)(x_3 \neg x_3) (x_1 \neg x_1)(x_2 \neg x_2) = (x_1 \neg x_1)(x_3 \neg x_3)$$

$$(x_1 \neg x_1)(x_3 \neg x_3) (x_1 \neg x_1)(x_2 \neg x_2) = (x_2 \neg x_2)(x_3 \neg x_3)$$

- S is closed under function composition

$$(x_2 \neg x_2)(x_3 \neg x_3) (x_2 \neg x_2)(x_3 \neg x_3) = (x_1) (x_2) (x_3) (x_4) = ()$$

- Each element of S is its own inverse



# Group Theory

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- Set of permutations  $S$ :
  - closed under the composition operator (which is associative)
  - contains an identity  $()$
  - every element has an inverse

$\Rightarrow S$  with composition operator is a group
- Groups:
  - structured set with operator
  - properties have been studied intensively
- If a set of clauses intuitively has structure, its set of permutations will be a group





# Group Theory - Definitions

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- $\text{Sym}(n)$  – the Symmetric group on  $n$  elements
  - the group made up of all permutations of  $\{1, \dots, n\}$
- $W_n$  – the subgroup of  $\text{Sym}(2n)$  s.t.  $\neg I_1$  is mapped to  $\neg I_2$  whenever  $I_1$  is mapped to  $I_2$
- Generators:  $\langle x \rangle$  is the group generated by the element  $x$ 
  - $\langle x \rangle = \{1, x, x^2, x^3, \dots, x^{m-1}\}$  where  $m$  is the smallest number s.t.  $x^m = 1$
  - Every group has a set of  $\leq \log_2 |G|$  generators
    - can find in poly time



# Progress

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- ✓ Motivation and Intuition
- ✓ Group Theory Background
- Augmented Resolution
  - Proof lengths of our examples
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# Reasoning and Inference

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- Reasoning with augmented clauses:
  - lifted form of resolution, watched literals for UP, and clause learning
- Lets start with resolution, since the size of resolution proofs determines the complexity of DPLL



# Augmented Clauses

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- Augmented clause  $(c, G)$ 
  - $c$  is the prototypical clause
  - $G$  is a group of permutations
  - $c^G = \{g(c) \mid g \in G\}$  - set of ground clauses represented
  - Note that if some clauses are not related to others, they can still be represented as  $(c, \{I\})$



# Augmented Resolution

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- Result of resolving  $(c_1, G_1)$  and  $(c_2, G_2)$ 
  - ideally another augmented clause  $(c, G)$
  - $(c, G)$  should capture all clauses which can be produced by resolving clauses in  $(c_1, G_1)$  and  $(c_2, G_2)$

- But this is not possible!

$$(c_1, G) = (a \vee b, (bc)) \rightarrow \{(a \vee b), (a \vee c)\}$$

$$(c_2, G) = (\neg a \vee d, (dc)) \rightarrow \{(\neg a \vee d), (\neg a \vee c)\}$$

Resolving ground clauses produces:

$$\{(b \vee d), (b \vee c), (c \vee d), (c)\}$$



# Augmented Resolution – cont.

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- Conditions for satisfactory resolution rule:
  - 1.  $(c_1, G_1) \wedge (c_2, G_2) \Rightarrow (c, G)$
  - 2.  $\text{resolve}(c_1, c_2)$  is an instance of  $(c, G)$
  - 3.  $G_1 \leq H_1, G_2 \leq H_2 \Rightarrow (c, G)$  is a resolvent of  $(c_1, H_1)$  and  $(c_2, H_2)$
  - 4., 5. & 6. on pages 501-502



# Augmented Resolution Rule

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- Resolvent of  $(c_1, G_1), (c_2, G_2)$  is any clause  $(\text{resolve}(c_1, c_2), G)$  s.t.
  - $G \leq \text{stab}(c_i, H_i) \cap W_n$  where  $H_1 \leq G_1, H_2 \leq G_2$
- What is  $\text{stab}(c_i, H_i)$  ???
  - subgroup of  $\text{Sym}(2n)$
  - $\omega \in \text{stab}(c_i, H_i)$  iff  $\omega$  behaves the same as some  $h_1 \in H_1$  on  $(c_1, H_1)$ , and behaves the same as some  $h_2 \in H_2$  on  $(c_2, H_2)$ ,



# Properties of Augmented Resolution

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- Time to find resolvent:
  - in NP  $\Rightarrow$  worst case exponential in size of augmented clauses
  - but: augmented clauses exponentially smaller than CNF encoding
  - $\therefore$  poly in the CNF encoding
- One augmented resolution step: how many resolutions between ground clauses?





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# Proof Lengths

- Representational Efficiency

clause type	Boolean axioms	generators	total size
cardinality	$\binom{m}{k-1}$	2	$m + 1$
parity	$2^{k-1}$	3	$k + 5$
QPROP	$d^v$	$2v$	$v(d + 1)$

- Proof Lengths

	efficiency of rep'n	proof length	resolution	propagation technique	learning method
SAT	—	EEE	—	watched literals	relevance
cardinality	exponential	P?E	not unique	watched literals	relevance
pseudo-Boolean	exponential	P?E	unique	watched literals	+ strengthening
symmetry	—	EEE*	not believed in P	same as SAT	same as SAT
QPROP	exponential	???	in P using reasons	exp improvement	+ first-order
ZAP	exponential	PPP			



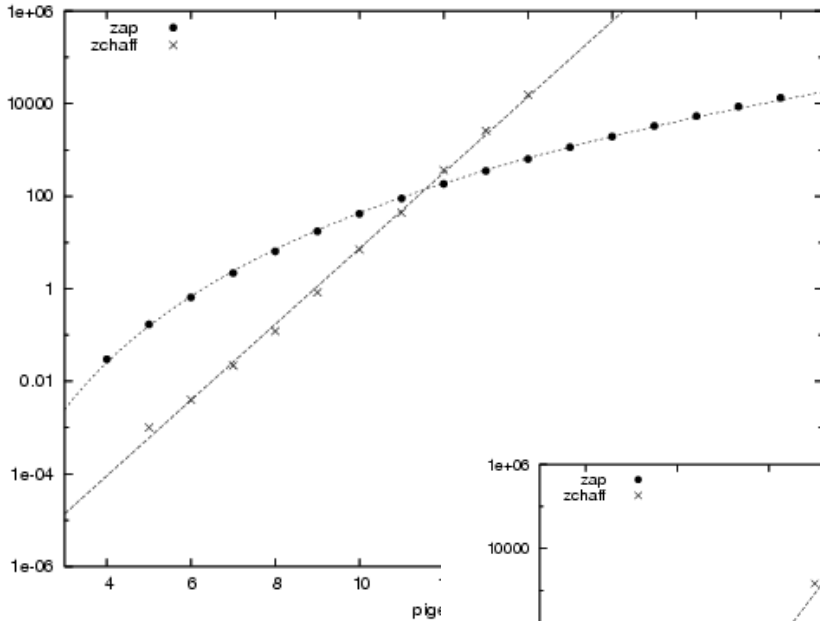
# Modified DPLL

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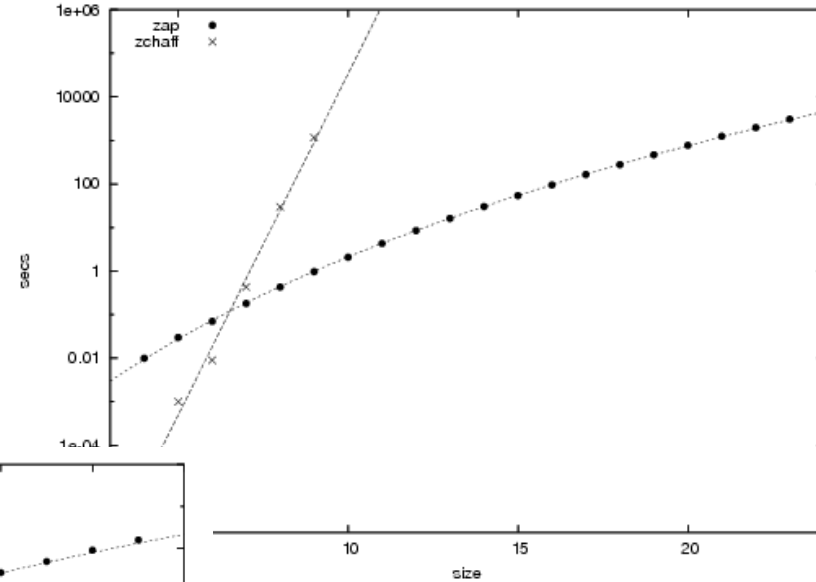
$\text{RBL}(C, D, P)$ :

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1   $\langle x, y \rangle \leftarrow \text{UNIT-PROPAGATE}(C \cup D, P)$ 
2  if  $x = \text{true}$ 
3      then  $\langle c, G \rangle \leftarrow y$ 
4          if  $c$  is empty
5              then return FAILURE
6          else remove successive elements from  $P$  so that  $c$  is unit
7               $D \leftarrow D \cup \{c\}$ 
8              remove from  $D$  all augmented clauses without  $k$ -relevant instances
9              return  $\text{RBL}(C, D, P)$ 
10 else  $P \leftarrow y$ 
11     if  $P$  is a solution to  $C$ 
12         then return  $P$ 
13     else  $l \leftarrow$  a literal not assigned a value by  $P$ 
14         return  $\text{RBL}(C, \langle P, (l, \text{true}) \rangle)$ 
```

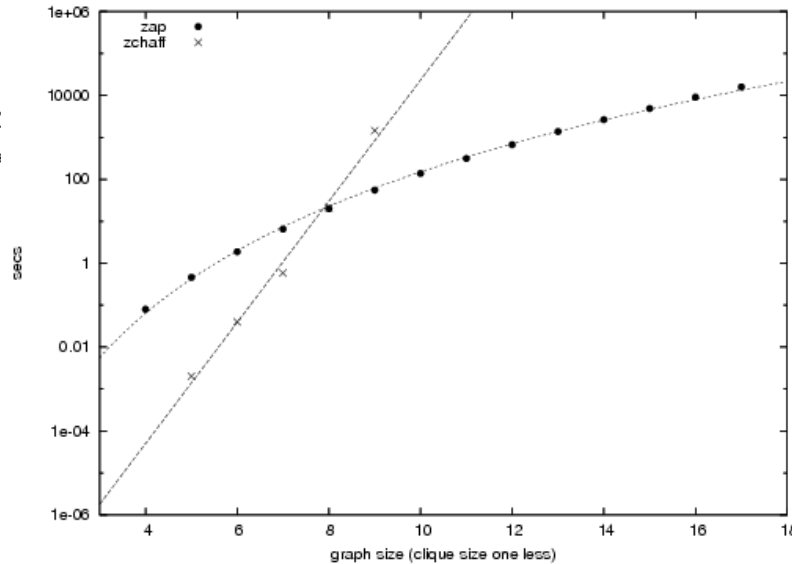
# Experimental Results



Pigeon Hole



Parity



Clique Colouring



# Summary

- New representation language of augmented clauses
- New inference rule: augmented resolution

	efficiency of rep'n	proof length	resolution	propagation technique	learning method
SAT	—	EEE	—	watched literals	relevance
cardinality	exponential	P?E	not unique	watched literals	relevance
pseudo-Boolean	exponential	P?E	unique	watched literals	+ strengthening
symmetry	—	EEE*	not believed in P	same as SAT	same as SAT
QPROP	exponential	???	in P using reasons	exp improvement	+ first-order
ZAP	exponential	PPP	in P using reasons	watched literals, exp improvement	+ first-order + parity + others



# Discussion

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- How often does group structure occur?
- How hard is it to find existing group structure?
- What about the completeness of augmented resolution?
- How does this representation subsume cardinality, pseudo-boolean, QPROP?