

# Nenofex: Expanding NNF for QBF Solving

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- “**N**egation **N**ormal **F**orm **E**xpansion”
- Solver for Quantified Boolean Formulae (QBF)
  - propositional formula + quantified variables
  - generalizes SAT
- Features
  - tree-based NNF representation
  - NNF expansion: less size increase for  $\exists$ -expansion than on CNF
  - tight, estimated expansion costs for greedy scheduling
  - NNF redundancy removal: techniques from circuit optimization
- Results on QBFEVAL'07 benchmark set
  - less frequently out-of-memory than resolution-based *Quantor* [Biere-SAT04]
  - important, but expensive redundancy removal on NNF
  - strong performance on instances from adder family (QBFLIB, Ayari)

- QBF

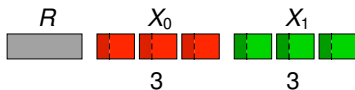
- PSPACE-complete decision problem
- exponentially more succinct than SAT
- CNF + quantifier prefix (prenex normal form):

$$\underbrace{S_1 S_2 \dots S_{n-1} S_n}_{\text{quantifier prefix}} \underbrace{\phi}_{\text{CNF}}$$

- $S_i$ : linearly ordered *scopes*
  - two notions: sets of quantified variables and quantifier scopes (as usual)
  - quantifier scope of  $x \in S_i$  in prefix ranges over whole formula  $\phi$
- Solving QBF by variable elimination:
  - from  $S_n$  to  $S_1$
  - expansion, Q-resolution or skolemization
- Our focus: solve by expansion
  - Quantor: CNF-based,  $\forall$ -expansion for  $S_{n-1}$ , Q-resolution for  $S_n$
  - Nenofex similar to Quantor but NNF-based, expansion only

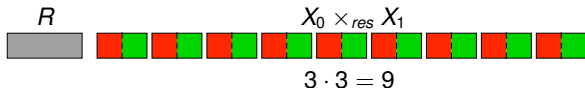
# Motivation (1/2): NNF-expansion vs. CNF-resolution

**Given:** CNF  $\phi \equiv R \wedge X_0 \wedge X_1$  with only  $\exists$ -variables



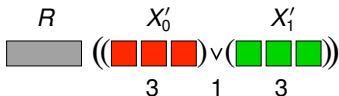
- sets  $X_0, X_1, R$ : clauses with negative, positive or no literal of variable  $x$

**Resolve  $x$ :**  $\phi_{res} \equiv R \wedge \bigwedge_{c \in (X_0 \times_{res} X_1)} c$

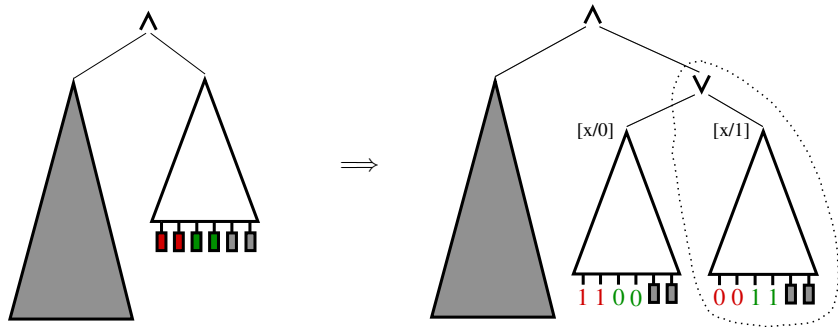


- generally: add  $|X_0| \cdot |X_1|$  resolvents
- worst case: *quadratic* size increase

**Expand  $x$ :**  $\phi_{exp} \equiv R \wedge ((X_0 \wedge X_1)[x/0] \vee (X_0 \wedge X_1)[x/1])$

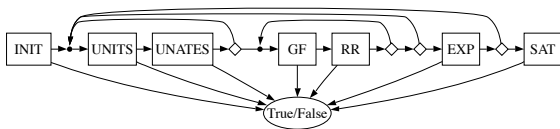


- add copy of  $\phi$  by  $\vee$ , factor out  $R$  and assign  $x$
- worst case: *linear* size increase



### General $\exists$ -expansion on NNF

- $\phi_{exp}$  grows linearly in the size of the subformula of  $x$
- NNF allows compact representation for expanding  $\exists$ -variables
- size increase in  $\forall$ -expansions: NNF and CNF equivalent

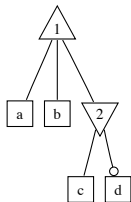


- Elimination of unit and pure literals (unates)
- Redundancy Removal
  - on small subformula only, cutoff criterion
- Expansion:  $S_1 \dots S_{n-1} S_n \phi$ 
  - from  $S_n$  to  $S_1$ , expand cheapest variable in  $S_{n-1}$  or  $S_n$  by scores
  - score(x): tight upper bound on size increase of NNF when expanding  $x$ 
    - partial score recomputation
- SAT solving
  - only  $\forall(\exists)$ -variables left  $\rightarrow$  generate CNF by Tseitin transformation
  - PicoSAT backend

**Negation Normal Form:** only  $\vee$  and  $\wedge$ ,  $\neg$  applied to literals only

## NNF-trees

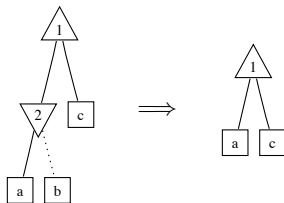
- internal nodes: operators  $\vee$  and  $\wedge$
- leaves: literal occurrence nodes (no sharing)
- $level(node) :=$  distance to root



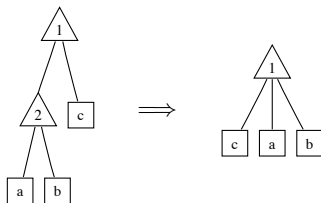
$$a \wedge b \wedge (c \vee \neg d)$$

**Structural Restrictions:** flat and compact NNF-trees (particularly for CNFs)

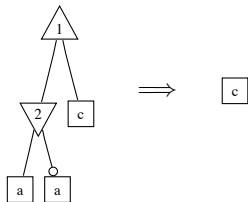
- number of children  $n \geq 2$ : operators denote  $n$ -ary boolean functions
  - $n = 1$  after deletion: merge nodes



- alternating types:  $type(parent) \neq type(child)$ 
  - apply associativity of  $\vee$  and  $\wedge$
  - prerequisite:  $n$ -ary operators



- one-level simplification: for var.  $x, \otimes \in \{\vee, \wedge\}$ , simplify  $x \otimes x, x \otimes \neg x$ 
  - remove trivial redundancy
  - bottom-up recursive effects





**Local Expansion for NNF:** copy only relevant parts

- Def.:  $ers(x)$  := expansion-relevant subformula of variable  $x$ 
  - smallest subformula which contains all occurrences of  $x$
- finding  $ers(x)$  by scope reduction [AyariBasin02] in prenex formulae:

$$Qx(\phi \otimes \psi) \equiv Qx(\phi) \otimes \psi \quad x \notin Vars(\psi), Q \in \{\forall, \exists\}, \otimes \in \{\vee, \wedge\}$$

**In NNF-trees:** for  $ers(x)$ , find *expansion-relevant subtree* to be copied

- correspondence: smallest subformulae and subtrees

**Expansion-relevant LCAs of Variables:** scope reduction in NNF-tree

- LCA: least common ancestor of set of nodes
- bottom-up approach for computing  $ers(x)$  starting from literals of  $x$
- expansion-relevant LCA of  $x$  denotes expansion-relevant subtree

## Expansion-relevant LCAs of Variables

- Def.: *expansion-relevant LCA* of  $x$  := node  $lca(x)$  and set *LCA-children*
- set *LCA-children*: (proper) subset of children of node  $lca(x)$ 
  - LCA-child  $c$ : subtree of  $c$  contains at least one occurrence of variable  $x$

**Expansion:**  $S_1 \dots S_{n-1} S_n \phi$ ,  $x \in S_n$ ,  $type(S_n) \in \{\forall, \exists\}$

- replace  $ers(x)$  by  $(ers(x)[x/0] \otimes ers(x)[x/1])$ ,  $\otimes \in \{\vee, \wedge\}$

**Expansion:**  $x \in S_{n-1}$ ,  $type(S_{n-1}) = \forall$

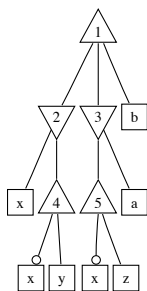
- duplicate depending  $\exists$ -variables  $D_x$  from  $S_n$

$$D_x^{(0)} := \{y \in S_n \mid y \text{ has literals in } ers(x)\}$$

$$D_x^{(k+1)} := \{z \in S_n \mid z \text{ has literals in } ers(y') \text{ for some } y' \in D_x^k\}, k \geq 0$$

$$D_x := \bigcup_k D_x^k$$

- $D_x$ : extended from CNF [BubeckKBüning-SAT07] to NNF
- universal expansion-relevant subformula  $urs(x)$ 
  - contains all literals of  $x$  and of depending variables in  $D_x$



**Global Flow (GF):** global analysis of logical flow of values

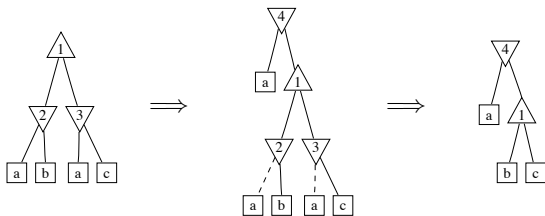
- implications: transform circuit to reduce size

$$x = 0 \rightarrow y = 0 : y \equiv x \wedge y \quad x = 1 \rightarrow y = 1 : y \equiv x \vee y$$

**Redundancy Removal (RR) by Automatic Test Pattern Generation (ATPG)**

- ATPG: structural testing of circuits (NP-complete)
- assume fault  $f$  at single signal  $s$  in circuit  $C$ : stuck-at- $\{0,1\}$  fault model
- find input  $v = (pi_0, \dots, pi_n)$  such that  $C(v) \neq C_f(v)$  uniquely caused by  $f$
- no such  $v$ :  $f$  is not testable, does not affect  $C$ , can remove HW at  $s$

**GF+RR implementation:** incomplete, polynomial-time



- full benchmark set (1136 instances) from QBFEVAL'07
- Pentium IV 3.0 GHz, Ubuntu Linux, limits 900 seconds and 1.5 GB
- Quantor as reference: CNF-based, similar strategy
  - three versions of Nenofex: GF, RR enabled/disabled

	Quantor	Nenofex		
		GF, RR	no GF, RR	no GF, no RR
<i>Solved</i>	<b>421</b>	361	352	313
<i>OOT</i>	<b>32</b>	124	103	83
<i>OOM</i>	683	<b>651</b>	681	740
<i>MEM-⊔</i>	1.10e6	1.15e6	1.17e6	1.23e6
<i>MEM-⊓</i>	10473	18472	19693	28422

	Quantor only	Both	Nenofex only	Sum
<i>Solved</i>	79	342	19	440
<i>OOT</i>	18	14	110	142
<i>OOM</i>	80	603	48	731

## Results

- less space-outs than CNF-based Quantor
  - node implementation in Nenofex not optimized for memory
- redundancy removal expensive but crucial for performance
  - GF, RR cause more time outs
- 19 uniquely solved instances

# Experimental Results (2/2): Ayari's adder benchmarks

- equivalence checking of  $n$ -bit ripple-carry adders [AyariBasin02]
  - structured QBF-encodings of monadic second order formulae
  - hard instances in previous QBF evaluations

Name	optimizations enabled				optimizations disabled			
	SAT-Vars	SAT-Clauses	Time (Exp.)	Mem	SAT-Vars	SAT-Clauses	Time (Exp.)	Mem
adder-2-unsat	41	94	0.07 (0.07)	<1	46	106	<0.01	<1
adder-4-unsat	240	585	0.37 (0.36)	2.6	284	712	0.06 (0.04)	<1
adder-6-unsat	722	1748	1.32 (1.22)	4.2	892	2241	0.23 (0.10)	4.2
adder-8-unsat	1586	3776	2.89 (2.60)	6.6	2004	5038	0.66 (0.24)	6.6
adder-10-unsat	3098	7277	5.62 (4.67)	10.2	3892	9745	1.88 (0.50)	10.2
adder-12-unsat	5126	12007	9.58 (7.47)	15.1	6644	16552	5.04 (0.89)	15.1
adder-14-unsat	8064	18755	15.48 (11.10)	21.3	10448	25999	13.31 (1.54)	21.3
adder-16-unsat	11921	27565	24.90 (15.35)	29.2	15596	38638	31.13 (2.47)	29.2
adder-2-sat	60	133	0.04 (0.04)	<1	76	118	<0.01	<1
adder-4-sat	236	549	0.39 (0.38)	2.4	550	1386	0.05 (0.04)	<1
adder-6-sat	1358	3259	1.58 (1.42)	3.3	1855	4779	0.39 (0.13)	3.3
adder-8-sat	6016	14663	4.91 (3.23)	5.0	5073	13127	1.64 (0.39)	4.7
adder-10-sat	8563	20901	8.87 (5.86)	6.9	10421	26988	5.94 (1.24)	7.7
adder-12-sat	17099	41795	20.10 (10.24)	11.4	20518	52481	17.86 (3.34)	14.6
adder-14-sat	56947	141095	92.29 (23.45)	67.4	39935	103316	53.32 (9.21)	23.5
adder-16-sat	85836	213038	173.80 (42.94)	46.5	119018	309598	372.58 (41.50)	65.6

## ● Results

- SAT-solving time dominates expansion time in large instances
- no optimizations: less expansion time but larger CNFs
- Quantor, sKizzo, squolem, ebddres:
  - comparable on adder-{2,4}-{sat,unsat}, sKizzo slower on adder-{2,...,10}-sat
  - abort on adder-{12,14,16}-{sat,unsat}, adder-{6,...,16}-unsat

- Expansion-based QBF solver for NNF
  - $\exists$ -expansion: linear vs. quadratic size increase on NNF and CNF
  - NNF-trees: flat formula representation
- Local expansion: scope reduction by quantifier rules
  - expansion-relevant subformulae, subtrees and LCAs
- Variables scores for greedy scheduling
  - tight upper bound on actual size increase of NNF-tree
- Redundancy removal: treat NNF-tree as circuit
  - GF: deriving implications for circuit transformations
  - ATPG-based RR: untestable faults correspond to redundant HW
  - implementation: incomplete, on small subtree only
- Experiments
  - less space-outs than CNF-based solver Quantor
  - GF+RR crucial for performance, although NNF more compact than CNF
  - adder-benchmarks
- Future work
  - optimize for run time and memory
  - incremental maintainance of scores