

# Quantified Boolean Formulas: Solving and Proofs

## Solving

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<https://github.com/JoshuaBlinkhorn/QBF>

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## Overview

# Solving technologies

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SAT

NP

established efficient technology

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QBF

PSPACE

happening now

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DQBF

NEXP

in its infancy

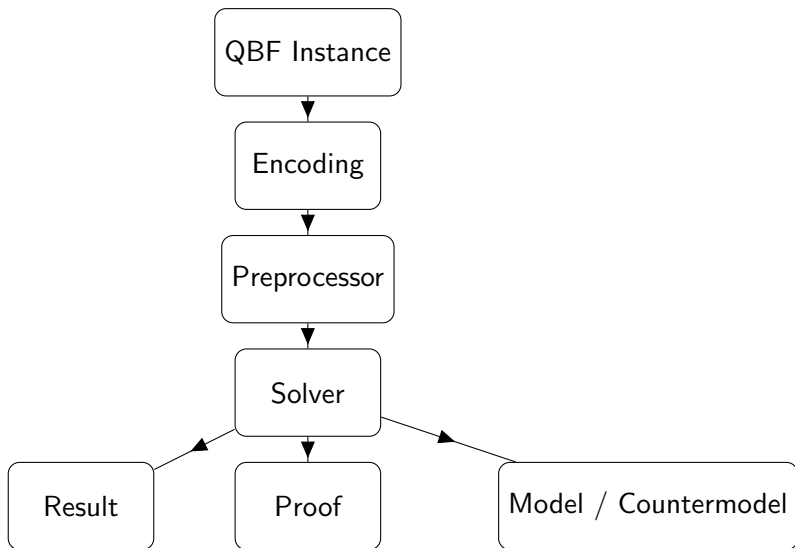
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## Leading Solvers

- In SAT, QCDCL is the dominant solving paradigm
- In QBF, there are various competitive paradigms

<b>Solver</b>	<b>Paradigm</b>	<b>Proof System</b>
RAReQS	CEGAR	$\forall\text{Exp}+\text{Res}$ (with NP oracle)
CAQE	Clausal Abstraction	Level-ordered Q-Res
Dep-QBF	QCDCL	LD-Q-Res
Dep-QBF	Dependency awareness	$Q(\mathcal{D})\text{-Res}$
Qute	Dependency learning	LD-Q-Res

## QBF Solving Workflow



# The DIMACS CNF Encoding

- machine readable encoding
- variables are natural numbers:  $x_1 \mapsto 1$ ,  $x_2 \mapsto 2$  etc.
- negation represented by minus:  $\overline{x_1} \mapsto -1$ ,  $\overline{x_2} \mapsto -2$  etc.

$$(x_1 \vee x_2 \vee x_3) \wedge (\overline{x_1} \vee \overline{x_2}) \wedge (\overline{x_3}) \wedge (\overline{x_1} \vee x_3)$$

```
p cnf 3 4
1 2 3 0
-1 -2 0
-3 0
-1 3 0
```

# The QDIMACS Prenex QCNF Encoding

- extends DIMACS
- existential quantifier represented by 'e'
- universal quantifier represented by 'a'

$$\exists x_1 \exists x_2 \forall x_3 \exists x_4 \cdot (x_1 \vee x_2 \vee x_3) \wedge (\overline{x_1} \vee \overline{x_3}) \wedge (\overline{x_2}) \wedge (\overline{x_3} \vee x_4)$$

```
p cnf 4 4
e 1 2 0
a 3 0
e 4 0
1 2 3 0
-1 -3 0
-2 0
-3 4 0
```

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## Preprocessing



## Why Preprocess?

- Preprocessors attempt to simplify a QBF while preserving its truth value
- Notion: easier to solve after preprocessing
- Usually, this means reducing the number of variables and the number of clauses
- There are a wide variety of preprocessing techniques
- The proof system QRAT was introduced to cover all of them
- Leading QBF preprocessors: bloqqer and HQS-Pre

## Purely Propositional Techniques

- Propositional preprocessing techniques that are logically correct still work for QBFs
- Subsumption:

$$Q \cdot (\bigwedge_i C_i) \wedge D \wedge E \quad \Rightarrow \quad Q \cdot (\bigwedge_i C_i) \wedge D$$

provided  $D$  is a subclause of  $E$

- Strengthening:

$$Q \cdot (\bigwedge_i C_i) \wedge (D \vee a) \wedge (E \vee \bar{a}) \quad \Rightarrow \quad Q \cdot (\bigwedge_i C_i) \wedge (D \vee \bar{a}) \wedge E$$

provided  $D$  is a subclause of  $E$

## Pure Literal Elimination

- Pure literal elimination is not propositionally logically correct; it only preserves satisfiability
- Works differently for existentials and universals

- Existential version:

$$\mathcal{Q} \cdot (\bigwedge_i C_i) \wedge \bigwedge_j (D_j \vee a) \Rightarrow \mathcal{Q} \cdot (\bigwedge_i C_i)$$

provided  $a$  is existential,  $\bar{a}$  doesn't appear in  $(\bigwedge_i C_i) \wedge (\bigwedge_j D_j)$

- Universal version

$$\mathcal{Q} \cdot (\bigwedge_i C_i) \wedge \bigwedge_j (D_j \vee a) \Rightarrow \mathcal{Q} \cdot (\bigwedge_i C_i) \wedge \bigwedge_j (D_j)$$

provided  $a$  is universal,  $\bar{a}$  doesn't appear in  $(\bigwedge_i C_i) \wedge (\bigwedge_j D_j)$

# Unit Literal Elimination

- Unit literal elimination is also not propositionally logically correct; but it does preserve satisfiability
- It can only be applied on **existential** unit clauses:

$$Q \cdot (\bigwedge_i C_i) \wedge (a) \Rightarrow (Q \cdot \bigwedge_i C_i)[\alpha]$$

provided  $a$  is existential, and  $\alpha$  is the smallest assignment satisfying  $a$

- Any QBF containing a universal unit clause is false

# Universal Reduction

- Universal reduction is logically correct in terms of QBF models
- So it preserves QBF truth value

$$\mathcal{Q} \cdot (\bigwedge_i C_i) \wedge (D \vee \textcolor{red}{a}) \quad \Rightarrow \quad \mathcal{Q} \cdot \bigwedge_i (C_i) \wedge D$$

provided  $\textcolor{red}{a}$  is universal, and  $\text{var}(\textcolor{red}{a})$  is quantified after all existentials in  $D$ , and  $(D \vee \textcolor{red}{a})$  is not a tautology

- As a consequence: we can often assume that the **final block** of a QBF with a CNF matrix is existentially quantified

# Blocked Clause Elimination

- Blocked clauses play a key role in SAT preprocessing
- It is an example of a **redundancy property**
- A redundancy property defines clauses that can be removed (or added) to a CNF while preserving satisfiability
- Propositionally, clause  $B$  is blocked w.r.t. a CNF  $F$  if  $B$  contains a literal for which all resolvents with  $F$  are tautologies
- The quantified version again requires a tweak:

$$\mathcal{Q} \cdot (\bigwedge_i C_i) \wedge (D \vee a) \quad \Rightarrow \quad \mathcal{Q} \cdot (\bigwedge_i C_i)$$

provided  $a$  is existential, and for all  $C_i$  containing  $\bar{a}$ ,  $C_i \otimes_{\bar{a}} D$  has complimentary literals in a variable left of  $\text{var}(a)$

## Blocked Literal Elimination

- This is the universal analogue of blocked clause elimination
- It allows a universal literal to be removed from a clause:

$$Q \cdot (\bigwedge_i C_i) \wedge (D \vee \textcolor{red}{a}) \Rightarrow Q \cdot (\bigwedge_i C_i) \wedge D$$

provided  $\textcolor{red}{a}$  is universal, and for all  $C_i$  containing  $\bar{\textcolor{red}{a}}$ ,  $C_i \otimes_{\bar{\textcolor{red}{a}}} D$  has complimentary literals in a variable left of  $\text{var}(\textcolor{green}{a})$

- In contrast to universal reduction, the removed literal is not necessarily right of all existential in the clause

## Covered Literal Addition

- Preprocessors sometimes **add** literals to clauses
- This can actually be useful - for example, it may increase the set of models for a true QBF
- Covered literal addition

$$Q \cdot (\bigwedge_i C_i) \wedge (D \vee a) \Rightarrow Q \cdot (\bigwedge_i C_i) \wedge (D \vee a \vee b)$$

provided  $a$  is existential,  $\text{var}(b)$  is left of  $\text{var}(a)$ , and for all  $C_i$  containing  $\bar{a}$ , either :

- $b$  is in  $C_i$ , or
- $C_i \vee D$  has complimentary literals in a variable left of  $\text{var}(a)$



# Existential Variable Elimination

- A method of removing existential variables in the final block
- Based on DP Resolution (Davis-Putnam)
- Propositionally:
  1. take a CNF  $F$
  2. choose a variable  $x$
  3. add all resolvents over  $x$  to  $F$
  4. remove all clauses containing  $x$
- This process preserves satisfiability - so it forms a CNF decision procedure
- For QBF, it can be performed on existentials in the final block while preserving truth value
- Hence, it forms a decision procedure for QBF in combination with universal reduction

# Universal Expansion

- Expansion of single universal variables preserves truth value
- Preprocessors may perform some universal expansions where it is considered beneficial
- This is a form of partial expansion (but it is **not** a partial expansion w.r.t. a subset of total universal assignments)
- Guided by heuristics

# Ownership and Acknowledgement

- In many cases, the QBF is solved **completely** in preprocessing
- This raises the question of acknowledgement - for example, in competitions (QBFEVAL)
- Janota: “I used MiniSAT and the C compiler!”

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## Expansion-based Solving

## Recap

- The expansion of a QBF  $\Phi = Q \cdot F$  is the CNF

$$\text{exp}(\Phi) := \bigcup_{\alpha \in \langle \text{vars}_{\forall}(\Phi) \rangle} F \left[ \alpha \cup \{ x \mapsto x_{\alpha} \upharpoonright L(x) : x \in \text{vars}_{\exists}(\Phi) \} \right]$$

- The partial expansion of a QBF  $\Phi = Q \cdot F$  w.r.t. a set of universal assignments  $R \subseteq \langle \text{vars}_{\forall}(\Phi) \rangle$  is the CNF

$$\text{exp}(\Phi, R) := \bigcup_{\alpha \in R} F \left[ \alpha \cup \{ x \mapsto x_{\alpha} \upharpoonright L(x) : x \in \text{vars}_{\exists}(\Phi) \} \right]$$

- The partial expansion may be unsatisfiable even when  $R \subset \langle \text{vars}_{\forall}(\Phi) \rangle$  is a proper subset of universal assignments

## Basic Expansion Decision Procedure

- Arguably the easiest way to solve a QBF  $\Phi$ :
  1. Write  $\text{exp}(\Phi)$  in DIMACS
  2. Pass it to a SAT solver
- **Benefit:** easy implementation - all work done by SAT solver
- SAT solver employed as an NP oracle
- **Drawback:** expansion is expensive
- Just computing the expansion takes exponential time if there are linearly many universal variables, even if the expansion is small

$$\text{exp}(\forall u_1 \cdots \forall u_n \cdot \top) = \top$$

- It makes sense to work with partial expansions

# Benders Decomposition

- A technique for solving linear programming problems
- Exploits **block structure** of a problem (variable set can be partitioned)
- **Divide-and-conquer** approach:
  - Divide variables into two sets  $A$  and  $B$
  - Solve the *master problem* over  $A$
  - For each candidate solution to the master problem, solve a *subproblem* over  $B$
  - If the subproblem is insoluble, generate a *cut* and add it to the master problem
  - The cut *rules out* the candidate: it will not be selected again
  - Resolve the master problem until no more cuts can be added

# Basic Benders Decomposition Approach to QBF

- Consider a QBF  $\Phi := \forall U \exists X \cdot F$
- A *winning move* for  $\Phi$  is  $\alpha \in \langle U \rangle$  such that  $F[\alpha]$  is unsatisfiable
- Goal: find a winning move for  $\Phi$ , if one exists
  1. Maintain a set of moves  $A \subseteq \langle U \rangle$ , initially empty
  2. Find a move  $\alpha \in \langle U \rangle$  not in  $A$
  3. Determine whether  $F[\alpha]$  is satisfiable with a SAT solver
  4. If not, return  $\alpha$
  5. If so, add  $\alpha$  to  $A$
  6. If  $A \neq \langle U \rangle$ , goto line 2
- Drawback: if  $\Phi$  is true, all assignments in  $\langle U \rangle$  *will* be tested
- In other words: total universal expansion of  $\Phi$  is constructed
- No information from subproblem passed to master problem



## An Extreme Example

- Consider what would happen with this QBF

$$\forall u \forall v \exists x \cdot (u \vee v \vee x) \wedge (u \vee \bar{v} \vee x) \wedge (\bar{u} \vee v \vee x) \wedge (\bar{u} \vee \bar{v} \vee x)$$

- Under every assignment to  $\{u, v\}$ , matrix satisfied by  $x \mapsto 1$
- SAT solver outputs this in *each* of the four subproblems
- Satisfying assignment to a subproblem explains why a candidate move fails
- We also call this a *counterexample* for the candidate
- In this case, it happens to be the same counterexample for each candidate
- Idea: add counterexamples back into the master problem

# Benders Decomposition Done Better

- Find a winning move for  $\Phi := \forall U \exists X \cdot F$ 
  1. Maintain a set of CNFs  $A$  in the variables  $U$ , initially empty
  2. Find a candidate move  $\alpha \in \langle U \rangle$  that falsifies all CNFs in  $A$
  3. Determine whether  $F[\alpha]$  is satisfiable with a SAT solver
  4. If not, return  $\alpha$
  5. If so, collect the satisfying assignment  $\beta$ , add  $F[\beta]$  to  $A$
  6. Goto line 2
- $\beta$  is a counterexample to  $\alpha$
- $\beta$  is also a counterexample to any  $\alpha'$  satisfying  $F[\beta]$
- Hence, in line 2, if no such move exists, then  $\Phi$  is true, because every candidate has a counterexample
- The set  $A$  is called an *abstraction*

## Extreme Example Revisited

- Consider again the QBF

$$\forall u \forall v \exists x \cdot (u \vee v \vee x) \wedge (u \vee \bar{v} \vee x) \wedge (\bar{u} \vee v \vee x) \wedge (\bar{u} \vee \bar{v} \vee x)$$

- Regardless of which candidate in  $\langle\{u, v\}\rangle$  is chosen first, the counterexample  $x \mapsto 1$  is found, and  $A = \{\top\}$
- Since  $\top$  has no falsifying assignments, we deduce that the QBF is true
- In this case, we only needed to consider a single candidate
- We avoided constructing the total universal expansion
- Essentially, we constructed a partial expansion, whose counterexamples formed a satisfiable abstraction

## Quantifiers Exchanged - the $\Sigma_2$ Version

- Consider a QBF  $\Phi := \exists X \forall U \cdot F$
- A *winning move* for  $\Phi$  is  $\alpha \in \langle X \rangle$  such that  $F[\alpha]$  is a tautology
- Goal: find a winning move for  $\Phi$ , if one exists
  1. Maintain a set of CNFs  $A$  in the variables  $X$ , initially empty
  2. Find a candidate move  $\alpha \in \langle X \rangle$  that satisfies all CNFs in  $A$
  3. Determine whether  $F[\alpha]$  is a tautology with a SAT solver
  4. If so, return  $\alpha$
  5. If not, collect the falsifying assignment  $\beta$ , add  $F[\beta]$  to  $A$
  6. Goto line 2
- $\beta$  is a counterexample to  $\alpha$  and any  $\alpha'$  falsifying  $F[\beta]$
- Hence, in line 2, if no such move exists, then  $\Phi$  is false, because every candidate has a counterexample

## Connections to Countermodels

- For a false  $\Sigma_2$  QBF  $\Phi := \exists X \forall U \cdot F$ , the set of counterexamples forms the **range of a countermodel**
  - Why? every candidate has a counterexample *amongst those encountered*
  - Hence, for each  $\alpha \in \langle X \rangle$  a counterexample  $\beta \in \langle U \rangle$  was encountered such that  $\alpha \cup \beta$  falsifies  $F$
  - In  $\Sigma_2$ , a countermodel is exactly such a mapping
- Hence we must encounter at least  $\sigma(\Phi)$  counterexamples, where  $\sigma(\Phi)$  is the minimum range of a countermodel for  $\Phi$
- Therefore  $\sigma(\Phi)$  is a lower bound on the running time of the algorithm
- The final abstraction is essentially the partial expansion of  $\Phi$  with respect to the set of counterexamples discovered

# CEGAR Solving

- CEGAR: Counterexample-guided Abstraction Refinement
- A form of Benders decomposition for solving QBF
- Block structure from quantifier prefix:  $\forall U_1 \exists X_1 \cdots \forall U_n \exists X_n$
- A leading CEGAR solver: RAReQs by Janota

# Multi-Games

- Merely convenient notation for the pseudocode
- **Definition:** A multi-game is an expression of the form  $QZ \cdot \{\Phi_1, \dots, \Phi_n\}$  where
  - $Q$  is a quantifier and  $Z$  is a block of variables
  - the  $\Phi_i$  are prenex QBFs whose only free variables are from  $Z$
  - the  $\Phi_i$  all have the same prefix  $Q$
  - the first quantifier of  $Q$  (if it is not the empty prefix) is opposite to  $Q$
  - the variables of  $Q$  are disjoint from  $Z$
- A winning move for a multigame is an assignment  $\alpha \in \langle Z \rangle$  such that
  - if  $Q = \exists$ , all  $\Phi_i[\alpha]$  are true
  - if  $Q = \forall$ , all  $\Phi_i[\alpha]$  are false
- Without loss of generality: assume final block is existential

## RAReQs Pseudocode

**Function:** RAReQs( $QZ \cdot \{\Phi_1, \dots, \Phi_n\}$ )

**Output:** A winning move for  $Q$ , or NULL if none exist

1. **if**  $\Phi_i$  have no quantifiers **then return**  $\text{SAT}(\bigwedge_i \Phi_i)$
2.  $A \leftarrow \emptyset$
3.  $\Psi \leftarrow QZ \cdot A$  // form initial empty abstraction
4. **while true do**
5.    $\alpha' = \text{RAReQs}(\Psi)$  // seek a winning move for the abstraction
6.   **if**  $\alpha' = \text{NULL}$  **then return** NULL
7.    $\alpha \rightarrow \alpha' \upharpoonright_Z$  // filter a move for  $Z$
8.   **for**  $i \in [n]$  **do**  $\mu_i \leftarrow \text{RAReQS}(\Phi_i[\tau])$  // look for a counterexample
9.   **if**  $\mu_i = \text{NULL}$  for all  $i \in [n]$  **return**  $\tau$
10.   **let**  $i \in [n]$  such that  $\mu_i \neq \text{NULL}$
11.   Remove  $QZ$  from the prefix of  $\Phi_i$
12.    $A \leftarrow A \cup \{\Phi_i[\mu_i]\}$  // refine the abstraction
13. **end**



## The Key to RAReQS' Success

- According to the author, RAReQS is based on  $\forall\text{Exp}+\text{Res}$
- A **formal** proof that an  $\forall\text{Exp}+\text{Res}$  refutation can be extracted from the solver trace on a false QBF has not been given
- RAReQS is arguably most successful expansion-based solver
- Key to success: abstraction limits the amount of expansion
- Building the abstraction and solving it is a serious overhead
- Trade-off against the benefit of partial expansion appears favourable

## RAReQS and Countermodels

- Consider RAReQS on a false QBF  $\Phi$
- Imagine the winning moves found for each universal block, concatenated with those from the recursive calls
- This generates a set  $S$  of total universal assignments
- $S$  is the range of a countermodel
- So  $\text{exp}(\Phi, S)$  is unsatisfiable
- Suggestion: RAReQS based on  $\forall\text{Exp}+\text{Res}$  with an NP oracle
- Hence minimal countermodel range  $\sigma(\Phi)$  is a lower bound for the algorithm running time
- Corollary: equality formulas should be hard for RAReQs