

# Q-Resolution with Generalized Axioms

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*19th International Conference on Theory and Applications of  
Satisfiability Testing, 5 - 8 July 2016, Bordeaux, France*



This work is supported by the Austrian Science Fund (FWF) under grants S11408-N23 and S11409-N23.

## Q-Resolution Calculus (QRES): [KBKF95]

- Prenex CNF  $\psi = \hat{Q}.\phi$  unsatisfiable iff empty clause derivable from  $\psi$ .
- Completeness: resolution on  $\exists$  pivots and universal reduction.
- Resolution on  $\forall$  pivots (QU-resolution) [VG12], long-distance resolution [ZM02a, BJ12], combinations thereof [BWJ14].
- QRES-based calculi vs. expansion/instantiation [BCJ15, JM15].
- Traditional QRES used for clause learning in QCDCL.

# Introduction (1/4)

## Problem:

- Problem (cf. previous talk [Jan16]): current implementations of QCDCL do not harness the full power of QRES in clause learning.
- Resolution in QCDCL guided by assignments.
- Prefix ordering restricts assignment generation in QCDCL.
- Axioms of QRES are weak.



# Introduction (2/4): QRES Clause Derivations

## Definition (Clause Axiom of QRES)

$\frac{}{C}$  Given a PCNF  $\psi = \hat{Q}.\phi$ ,  $C \in \phi$  and for all  $x \in \hat{Q}$ :  $\{x, \bar{x}\} \not\subseteq C$ .

## Example

- Long distance Q-resolution [ZM02a, BJ12].
- Only  $\exists$  pivots.
- Tautologies over  $\forall$  variables (pivot level!).

$$\begin{array}{cc} (\bar{x} \vee u \vee \bar{y}) & (x \vee \bar{u} \vee \bar{z}) \\ & \swarrow \quad \searrow \\ & (u \vee \bar{u} \vee \bar{y} \vee \bar{z}) \end{array}$$

$$\psi = \exists x \forall u \exists y \forall v \exists z.$$

$$(x) \wedge$$

$$(\bar{x} \vee u \vee y) \wedge$$

$$(\bar{x} \vee u \vee \bar{y}) \wedge$$

$$(x \vee \bar{u} \vee \bar{z})$$

$$(x \vee u \vee \bar{z})$$

- QRES variants: different power but same clause axiom.
- Clause axiom derives only input clauses (falsified in QCDCL).

## Introduction (2/4): QRES Clause Derivations

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### Example

- QU-resolution [VG12].
- $\forall/\exists$  pivots.
- No tautologies.
- LQU<sup>+</sup>-Res:  $\forall/\exists$  pivots and tautologies [BWJ14].

$$\begin{array}{cc} (x \vee \bar{u} \vee \bar{z}) & (x \vee u \vee \bar{z}) \\ & \swarrow \quad \searrow \\ & (x \vee \bar{z}) \end{array}$$

$$\psi = \exists x \forall u \exists y \forall v \exists z.$$

$$(x)$$

$$(\bar{x} \vee u \vee y) \wedge$$

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$$(x \vee \bar{u} \vee \bar{z})$$

$$(x \vee u \vee \bar{z})$$

- QRES variants: different power but same clause axiom.
- Clause axiom derives only input clauses (falsified in QCDCL).

### QRES for Satisfiable QBFs: [GNT06, Let02, ZM02b]

- Operates on cubes (conjunctions of literals).
- Dual to QRES for clauses: cube resolution and existential reduction.
- Prenex CNF  $\psi = \hat{Q}.\phi$  satisfiable iff empty cube derivable from  $\psi$ .
- Traditional QRES used for cube learning in QCDCL.

# Introduction (4/4): QRES Cube Derivations

## Definition (Cube Axiom of QRES [GNT06, Let02, ZM02b])

$\frac{}{C}$  Given a PCNF  $\psi = \hat{Q}.\phi$  and an assignment  $A$  with  $\{x, \bar{x}\} \not\subseteq A$  and  $\psi[A] = \top$ ,  $C = (\bigwedge_{l \in A} l)$  is a cube.

## Example

- Axiom: model generation.  $(\bar{x} \wedge u \wedge \bar{y}) \quad (\bar{x} \wedge \bar{u} \wedge y) \quad \psi = \exists x \forall u \exists y.$
- Cubes at leaves are part of DNF of  $\phi$ .  $(\bar{x} \wedge u) \quad (\bar{x} \wedge \bar{u}) \quad (\bar{x} \vee u \vee \bar{y}) \wedge$   
 $(\bar{x} \vee \bar{u} \vee y) \wedge$
- Existential reduction.  $(\bar{x}) \quad (x \vee u \vee y) \wedge$
- Cube resolution.  $\emptyset \quad (x \vee \bar{u} \vee \bar{y})$

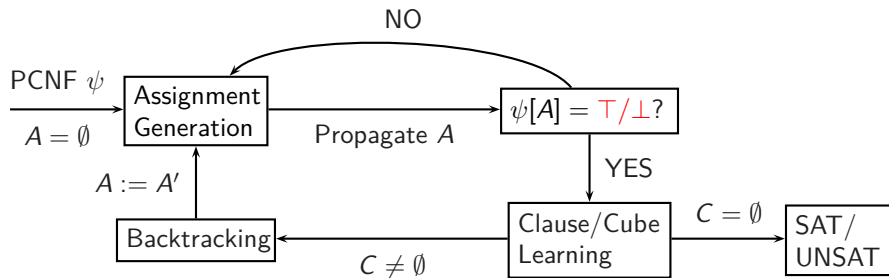
- Cube axiom allows to derive only CNF models of  $\psi$ .
- Trivial formulas with exponential cube proofs: [RBM97, Let02]  
 $\Psi(n) = \forall u_1 \exists x_1 \dots \forall u_n \exists x_n. \bigwedge_{i=1}^n [(u_i \vee \bar{x}_i) \wedge (\bar{u}_i \vee x_i)]$



# Contributions

- Generalized axioms: stronger clauses/cubes at leaves of derivations.
- Idea: check satisfiability of PCNF  $\psi$  under assignment  $A$  in QCDCL.
- Integration of arbitrary QBF proof system in QRES via axioms.
- Stronger QRES variants by integrating orthogonal proof systems.
- Tight integration in QCDCL by learning asserting clauses/cubes.
- Implementation in DepQBF, experimental study.
- Formula class  $CR_n$  from previous talk [Jan16]: short QRES proofs by QCDCL based on stronger axiom.

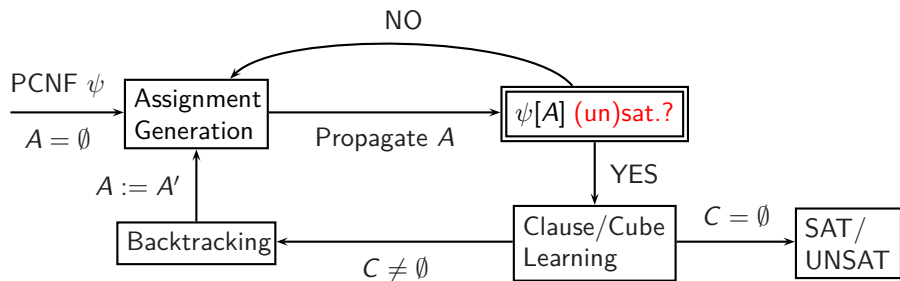
# QCDCL (1/2)



## Traditional Axioms:

- *QCDCL assignments*: select decision variables from left end of prefix of  $\psi[A]$ , unit and pure literal detection out of prefix order.
- $\psi[A] = \perp$ : CNF  $\phi$  contains a falsified clause.
- $\psi[A] = \top$ : all clauses in CNF  $\phi$  satisfied.
- Asserting clause (cube)  $C$ :  $C[A']$  unit for some  $A' \subseteq A$ .

## QCDCL (2/2)



### Generalized Axioms:

- Check satisfiability of  $\psi[A]$  in QBCP by incomplete approaches.
- QBF is hard: spend more time on reasoning before assigning decision variables (similar argument as in, e.g., [SB06]).
- $\psi[A] \text{ (un)sat.}$ : derive asserting clause (cube)  $C$  from a start clause (cube) generated based on  $A$ .

# Generalized Axioms: Theory

## Definition (Generalized Clause Axiom)

$\frac{}{C}$  Given a PCNF  $\psi = \hat{Q}.\phi$  and a QCDCL assignment  $A$ ,  $\psi[A]$  is **unsatisfiable**, and  $C = (\bigvee_{I \in A} \bar{I})$  is a clause.

## Definition (Generalized Cube Axiom)

$\frac{}{C}$  Given a PCNF  $\psi = \hat{Q}.\phi$  and a QCDCL assignment  $A$ ,  $\psi[A]$  is **satisfiable**, and  $C = (\bigwedge_{I \in A} I)$  is a cube.

## Proposition (Soundness)

*For a clause (cube)  $C$  derived by the generalized clause (cube) axiom:*  
 $\hat{Q}.\phi \equiv_{\text{sat}} \hat{Q}.\phi \wedge C$ , respectively  $\hat{Q}.\phi \equiv_{\text{sat}} \hat{Q}.\phi \vee C$ .

## Axiom Applications in QCDCL:

- Any QBF proof system can be used to check satisfiability of  $\psi[A]$ .
- Combinations of proof systems within QRES via generalized axioms.
- Clauses (cubes) by generalized axioms used as usual in learning.
- Checking satisfiability of PCNF  $\psi[A]$  is PSPACE-complete.

## Incomplete QBF Satisfiability Checks:

- E.g. bounded variable expansion [Bie04, BB07]: QBF preprocessing.
- E.g. SAT-based techniques in early QDPLL [CGS98]:
  - Trivial truth: check  $\psi'$  obtained by discarding all  $\forall$  literals in  $\psi$ .
  - Trivial falsity: check  $\psi'$  obtained by treating every variable in  $\psi$  as  $\exists$ .
- If unsuccessful: extend  $A$  to  $A'$  by decisions and QBCP, check  $\psi[A']$ .

# Formalizing the Use of SAT Solving

## Definition (Abstraction-Based Clause Axiom)

For PCNF  $\psi = \hat{Q}.\phi$ ,  $Abs_{\exists}(\psi) := \exists(X_1 \cup \dots \cup X_n).\phi$ .

$\frac{}{C}$  For a PCNF  $\psi = \hat{Q}.\phi$ , and a **(non-)**QCDCL assignment  $A$ ,  $Abs_{\exists}(\psi)[A]$  is unsatisfiable, and  $C = (\bigvee_{I \in A} \bar{I})$  is a clause.

## Proposition (cf. appendix of [LES16])

*QRES with the abstraction-based clause axiom  $p$ -simulates QU-resolution.*

## Example

$\frac{C' \cup \{p\} \quad C'' \cup \{\bar{p}\}}{C' \cup C''}$  Let  $q(p) = \forall$  and clause  $C = C' \cup C''$  be derived by QU-resolution.

- For  $A = \{\bar{I} \mid I \in C\}$ ,  $Abs_{\exists}(\psi)[A]$  unsatisfiable:  $(p), (\bar{p}) \in Abs_{\exists}(\psi)[A]$ .
- Hence  $C$  derivable by QRES with the abstraction-based clause axiom.

## Short Proof of $CR_n$ by QCDCL

### Definition ([Jan16])

For  $i, j \in \{1, \dots, n\}$ ,

$$CR_n := \exists x_{ij} \forall z \exists a_i, b_i. (x_{ij} \vee z \vee a_i) \wedge (\bar{x}_{ij} \vee \bar{z} \vee b_j) \wedge (\bigvee \bar{a}_i) \wedge (\bigvee \bar{b}_i)$$

- 1 We assume a “perfect” restart and assignment strategy in QCDCL.
- 2 By QCDCL, derive  $(x_{1,j} \vee \dots \vee x_{n,j})$  and  $(x_{i,1} \vee \dots \vee x_{i,n})$  for all  $i, j$  by QCDCL assignments  $A := \{\bar{x}_{1,j} \dots \bar{x}_{n,j}\}$ ,  $A = \{\bar{x}_{i,1} \dots \bar{x}_{i,n}\}$ .
- 3 By abstraction-based axiom, derive clauses  $(x_{i,j} \vee a_i)$  and  $(x_{i,j} \vee b_j)$  by *non-QCDCL* assignments  $A := \{\bar{x}_{i,j}, \bar{a}_i\}$  and  $A := \{\bar{x}_{i,j}, \bar{b}_j\}$ , respectively. (The SAT solver needs the clauses derived in step 2).
- 4 Derive unit clauses  $(x_{ij})$  in QCDCL using QCDCL assignments  $A := \{\bar{x}_{ij}\}$ . (By clauses from step 3, we get propagations on  $a_i, b_j$ ).
- 5 Get  $\emptyset$  by unit resolution with  $(x_{ij})$  clauses, resolution on  $(\bigvee \bar{b}_i)$ .

*All resolution derivations above are polynomial, also inside the SAT solver.*

## QBF Preprocessing:

- Incomplete solving.
- QBF preprocessors may have considerable solving power [LSVG16].
- Integration of Bloqer: <http://fmv.jku.at/bloqer/>.
- Clause and cube learning wrt. SAT/UNSAT result.
- Nonincremental,  $\psi[A]$  added to Bloqer always from scratch.



## SAT Solving:

- Integration of PicoSAT: abstraction-based axiom, trivial truth.
- Incremental solving under QCDCL assignment  $A$  (assumptions).
- Failed assumptions  $A' \subseteq A$ : already  $Abs_{\exists}(\psi)[A']$  unsatisfiable.
- Clauses learned based on possible *non-QCDCL* assignments  $A'$ .
- Effects of QU-resolution in QCDCL.

# Implementing Generalized Axioms in QCDCL

## Dynamic Blocked Clause Elimination (QBCE): [LBB<sup>+</sup>15]

- Apply QBCE incrementally in QBCP by watched data structures.
- Empty formula: cube learning by generalized axiom.

### Example ([LBB<sup>+</sup>15])

$\exists z, z' \forall u \exists y.$

$(u \vee \bar{y}) \wedge (\bar{u} \vee y) \wedge (z \vee u \vee \bar{y}) \wedge (z' \vee \bar{u} \vee y) \wedge (\bar{z} \vee \bar{u} \vee \bar{y}) \wedge (\bar{z}' \vee u \vee y)$

- Initially  $A = \emptyset$  and no clause blocked in  $\psi[A] = \psi$ .
- For  $A = \{\bar{z}, \bar{z}'\}$  all clauses blocked in  $\psi[A] = \forall u \exists y. (u \vee \bar{y}) \wedge (\bar{u} \vee y)$ .
- Derive  $C = (\bar{z} \wedge \bar{z}')$  by generalized cube axiom and immediately  $\emptyset$ .

- Exponential cube proofs with traditional axiom:

$$\Phi(n) = \exists z_1, z'_1 \forall u_1 \exists y_1, \dots, \exists z_n, z'_n \forall u_n \exists y_n. \bigwedge_{i=1}^n [C_0(i) \wedge C_1(i) \wedge C_2(i)],$$

$$C_0(i) = (u_i \vee \bar{y}_i) \wedge (\bar{u}_i \vee y_i),$$

$$C_1(i) = (z_i \vee u_i \vee \bar{y}_i) \wedge (z'_i \vee \bar{u}_i \vee y_i),$$

$$C_2(i) = (\bar{z}_i \vee \bar{u}_i \vee \bar{y}_i) \wedge (\bar{z}'_i \vee u_i \vee y_i).$$

# Experiments

## Variants of DepQBF:

- DQ: only dynamic QBCE.
- DQ-T: + trivial truth.
- DQ-A: + abs. clause axiom.
- DQ-B: + Bloqqer.
- DQ-BAT: all listed above.

<i>Solver</i>	<i>#T</i>	<i>#U</i>	<i>#S</i>	<i>Time</i>
DQ-BAT	466	236	230	553K
DQ-AT	461	234	227	555K
DQ-A	459	237	222	561K
DQ-B	449	222	227	563K
DQ-T	441	220	221	571K
DQ	441	224	217	575K
QELL-nc	434	302	132	563K
RAReQS	414	272	142	611K
CAQE	370	192	178	708K
GhostQ	347	166	181	752K
QESTO	331	188	143	767K

- QBF Gallery 2014 application benchmark set (735 formulas).
- Total solved ( $\#T$ ), solved unsatisfiable ( $\#U$ ), and satisfiable ( $\#S$ ).
- No preprocessing by Bloqqer.

# Experiments

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- DQ: only dynamic QBCE.
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- DQ-A: + abs. clause axiom.
- DQ-B: + Bloqqer.
- DQ-BAT: all listed above.

<i>Solver</i>	<i>#T</i>	<i>#U</i>	<i>#S</i>	<i>Time</i>
QELL-nc	483	306	177	480K
DQ-AT	483	260	223	509K
DQ-A	481	262	219	528K
DQ-BAT	480	257	223	516K
RAReQS	471	272	199	509K
CAQE	465	248	217	534K
DQ-T	464	243	221	526K
DQ	456	242	214	542K
DQ-B	450	245	205	550K
QESTO	401	212	189	662K
GhostQ	306	148	158	823K

- QBF Gallery 2014 application benchmark set (735 formulas).
- Total solved ( $\#T$ ), solved unsatisfiable ( $\#U$ ), and satisfiable ( $\#S$ ).
- Restricted preprocessing by Bloqqer (only QBCE and  $\forall$  expansion).

# Experiments

## Variants of DepQBF:

- DQ: only dynamic QBCE.
- DQ-T: + trivial truth.
- DQ-A: + abs. clause axiom.
- DQ-B: + Bloqqer.
- DQ-BAT: all listed above.

<i>Solver</i>	<i>#T</i>	<i>#U</i>	<i>#S</i>	<i>Time</i>
RAReQS	547	314	233	379K
QELL-nc	501	301	200	445K
QESTO	463	248	215	558K
DQ-AT	434	209	225	579K
DQ-BAT	432	209	223	585K
DQ-T	426	200	226	586K
DQ-A	418	207	211	623K
DQ-B	409	201	208	622K
DQ	407	200	207	623K
CAQE	401	193	208	640K
GhostQ	350	176	174	739K

- QBF Gallery 2014 application benchmark set (735 formulas).
- Total solved ( $\#T$ ), solved unsatisfiable ( $\#U$ ), and satisfiable ( $\#S$ ).
- Full preprocessing by Bloqqer.

# Experiments

*Solver rankings: no (n), restricted (r), full preprocessing (f)*

<i>Solver</i>	<i>n</i>	<i>r</i>	<i>f</i>
CAQE	9	6	10
DQ	6	8	9
DQ-A	3	3	7
DQ-AT	2	2	4
DQ-B	4	9	8
<b>DQ-BAT</b>	<b>1</b>	4	5
DQ-T	5	7	6
GhostQ	10	11	11
<b>QELL-nc</b>	7	<b>1</b>	2
QESTO	11	10	3
<b>RAReQS</b>	8	5	<b>1</b>

- Three different winning solvers/approaches.
- Preprocessing may be harmful to the performance of certain solvers.

# Conclusion and Outlook

## Generalized Axioms in QRES:

- Derive clauses (cubes) other than input clauses (CNF models).
- Interface to combining QRES with orthogonal QBF proof systems.
- In QCDCL: incomplete QBF satisfiability check of  $\psi[A]$ .
- Applicable to any variant of QRES (long-distance, QU-, ...).
- Proof search more complex due to additional proof rules ( $CR_n$  class).

## Proof Generation:





- A clause (cube)  $C$  obtained by generalized axioms has a proof  $P$  (perhaps) in a proof system other than QRES.
- $P$  is part of the final proof  $P'$  produced by QRES e.g. in QCDCL.
- Checking  $P'$  requires to check subproofs  $P$  in different proof systems.

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