

# Beyond SAT - Proofs for QBF, and more

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## Quantified Boolean Formulas (QBFs) and Formal Proofs

- A Proof Complexity perspective
- A QBF-Solving perspective
- A Computational Complexity perspective

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- Some Questions / Directions / Speculations ...

# Quantified Boolean Formulas

- Propositional satisfiability:  
Is  $\varphi(x_1, x_2, \dots, x_n)$  satisfiable?  
Restated as QBF:  
Is  $\exists x_1 \exists x_2 \dots \exists x_n \varphi(x_1, x_2, \dots, x_n)$  true?
- Generalise: allow  $\forall$  quantifiers as well. For  $Q_i \in \{\exists, \forall\}$ ,  
Is  $Q_1 x_1 Q_2 x_2 \dots Q_n x_n \varphi(x_1, x_2, \dots, x_n)$  true?
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- Same expressiveness as SAT, but more succinct.
- Deciding True/False: PSPACE-complete.
- We consider QBFs that are
  - totally quantified (no unbound variables),  
(each such QBF either true or false)
  - in prenex form,
  - with inner propositional formula in CNF.

# The two-player evaluation game

- QBF  $Q\vec{x} \cdot F(\vec{x})$
- Two players,  $P_{\exists}$  and  $P_{\forall}$ , step through quantifier prefix left-to-right.  $P_{\exists}$  picks values for  $\exists$  variables,  $P_{\forall}$  for  $\forall$  variables.  
Assignment constructed on a run:  $\tilde{a}$ .  
 $P_{\exists}$  wins a run of the game if  $F(\tilde{a})$  true. Otherwise  $P_{\forall}$  wins.
- $Q\vec{x} \cdot F(x)$  true if and only if  $P_{\exists}$  has a **winning strategy**.  
(model, Skolem function)
- $Q\vec{x} \cdot F(x)$  false if and only if  $P_{\forall}$  has a **winning strategy**.  
(countermodel, Herbrand function)

# Talk Plan

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# Proof System

What we expect from a proof system:

- Proofs should be **short**.
- Proofs should be **efficiently verifiable**.
- **Soundness** – no proofs of false statements.
- **Completeness** – proofs of all true statements.

# Proof Systems for refuting QBFs

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# Proof Systems for refuting QBFs

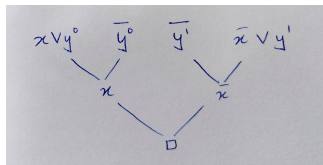
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- Ensuring soundness: (augmented) rules allow extraction of a  $P_{\forall}$  winning strategy (Herbrand function) from a proof.
- Ensuring Completeness: different paradigms.
  - Expansion ( $\forall \rightarrow \wedge$ ) – obvious semantics of universal variables
  - Universal reduction – preserves  $P_{\exists}$  winning strategy if one exists
  - Literal Merging – implicitly remember  $P_{\forall}$  winning strategy may be complex
  - Explicitly building up  $P_{\forall}$  winning strategy

# Proof Systems for refuting QBFs (by example)

$$\exists x \forall u \exists y \quad (x \vee u \vee y)(\bar{x} \vee \bar{u} \vee y)(\bar{y})$$

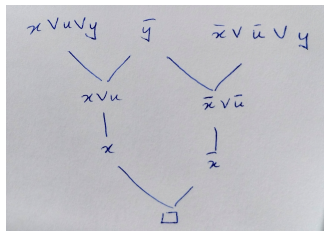
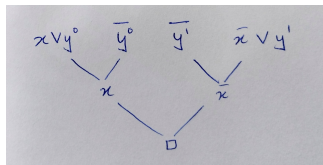
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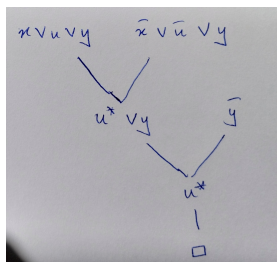
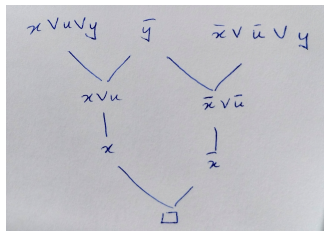
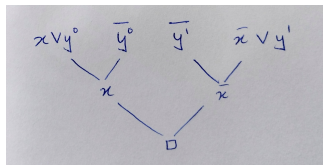
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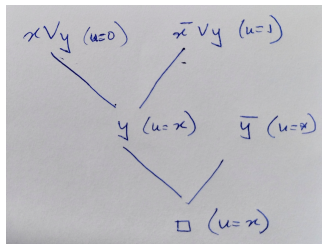
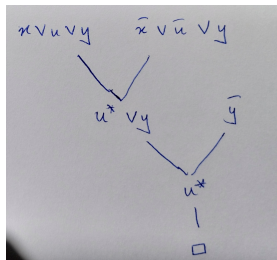
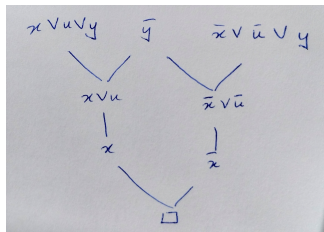
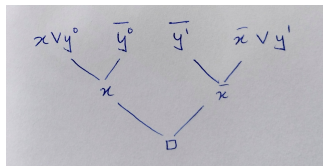
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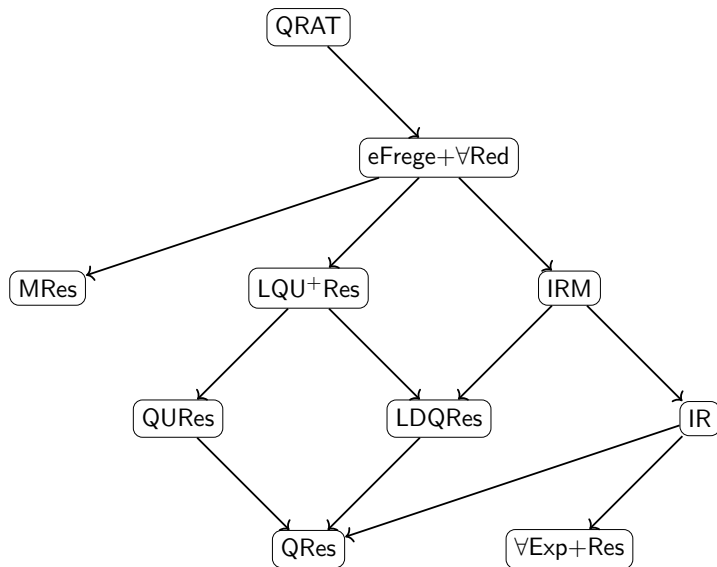


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# Some QBF Proof Systems – The simulation order



(Accident of nomenclature: What is truly Resolution for QBFs?)

# Augmenting PPS to QBF proof systems

- Expansion works for **any** PPS.
- Universal reduction,  $P + \forall\text{red}$ , works for **most** line-based PPS.
- Literal merging: seems specific to Resolution, and not yet fully understood.
- Explicitly building up  $P_{\forall}$  strategies: seems specific to Resolution, but not fully understood.

Are there other undiscovered paradigms?

# Techniques for Lower Bounds

- Transfer propositional hardness.
- Transfer computational hardness.
- Identify semantic hardness.

# Lower Bounds: Transferring Propositional Hardness

- Inside every reasonable QBF proof system  $P$ , there is an easily-described embedded PPS  $Q$ .
- In a reasonable QBF proof system  $P$ , with underlying PPS  $Q$ , for every UNSAT formula  $F$ , refuting  $\exists.F$  in  $P$  no easier than proving unsatisfiability of  $F$  in  $Q$ .

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So we already have lower bounds.

- Not “genuine QBF hardness”.
- Feasible Interpolation gives lower bounds in many QBF systems. Again, not “genuine QBF hardness”.
- Prover-Delayer game-based arguments give lower bounds in treelike QRes. Again, not “genuine QBF hardness”.



# What is “Genuine QBF Hardness”?

Genuine QBF hardness –  
not hardness stemming merely from underlying propositional hardness.

Formalising genuineness –

- in expansion systems, seems natural.
- in reduction systems: the NP-oracle.  
Discount deduction steps that employ reasoning checkable by reduction to SAT.  
Effectively, count only reduction steps.
- in systems using merging: Discount deduction steps that employ reasoning without affecting partial information about  $P_{\forall}$  winning strategy.

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- Why stop at NP-oracle? Other oracles – hierarchy....

# Lower Bounds: Transferring Computational Hardness – 1

In many QBF systems, computational hardness can be transferred:  
Efficient Strategy Extraction.

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Refutations in  $P$  yield circuits in  $M$  for  $P_{\forall}$  winning strategies.
- Find function  $f$  in P/poly hard in  $M$ .
- Using P/poly circuit description, construct false  $\Sigma_3$  formula where winning strategy must compute  $f$ .

## Lower Bounds: Transferring Computational Hardness – 2

- In  $\mathcal{C}$ -Frege+ $\forall$ red systems, only two sources of hardness:
  - propositional hardness of a related formula, or
  - $\mathcal{C}$  lower bounds.
- From a proof in  $\mathcal{C}$ -Frege+ $\forall$ red, efficiently **extract**
  - a set of **witnessing circuits** in  $\mathcal{C}$ , and
  - a **propositional proof** that the circuits compute a  $P_{\forall}$  winning strategy (**witness validation**).
- No short proofs for QBFs if every countermodel is either computationally hard, or hard to validate, or both.  
(Thus, lower bounds even for  $AC^0[p]$ -Frege+ $\forall$ red.)

# Lower Bounds: Transferring Computational Hardness – 3

- Hardness via Size-Width relation: doesn't work for QRes.
- A modified adaptation works for QURes; gives lower bounds for bounded alternation formulas.  
Key idea: Circuit characterisation of QURes proofs.
- Fits the template of transferring computational hardness.

# Lower Bounds: Identify semantic hardness

- In systems between QRes and EFrege+ $\forall$ red, a seemingly third source of hardness.
- Formulas with no underlying propositional hardness, and with trivial winning strategies, can be hard.
  - size (of proof), cost (of formula), capacity (of proof system)
  - strategy size, strategy weight
  - formula gauge



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  - strategy size, strategy weight
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- Is this really a third source, or is it just that we haven't identified the right circuit model?
- eg The Equality Formulas: cost, weight, gauge, high.  
But winning strategies trivial, projections.  
Still, hard in a multi-output decision-list model – explains QURes hardness.

# Questions

- Exploit game semantics better to design new proof systems.
- Harness the power of algebraic reasoning.  
(QBF analogues of static pps?)
- Identify more candidate hard formulas.
  - Exploit succinctness of QBF as opposed to CNF-SAT instance.
  - Mathematical principles? (PHP, Tseitin, mutilated chessboard, ...)
  - Based on computation?
- Formalise the “random formula” model.
- Characterise more proof systems via appropriate circuit classes.
- Understand the sources of hardness.

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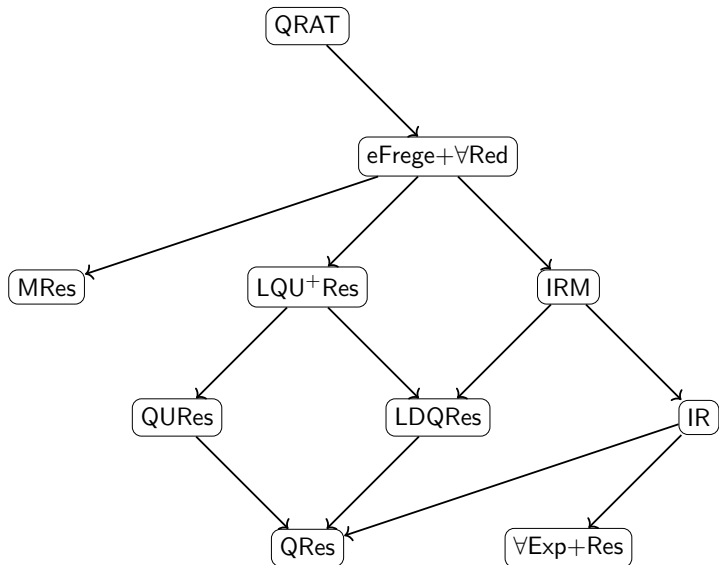
# Proof Systems and QBF solving

- CDCL: a nondeterministic template for an algorithm for (UN)SAT.
- CDCL  $\equiv$  Resolution.  
Analog in QBF world?  
Which of the **QBF Resolution** proof systems reflects Q-CDCL?
- Lifting CDCL to QBF: potentially many ways.  
Which algorithm is the right lift? truly **Q-CDCL**?

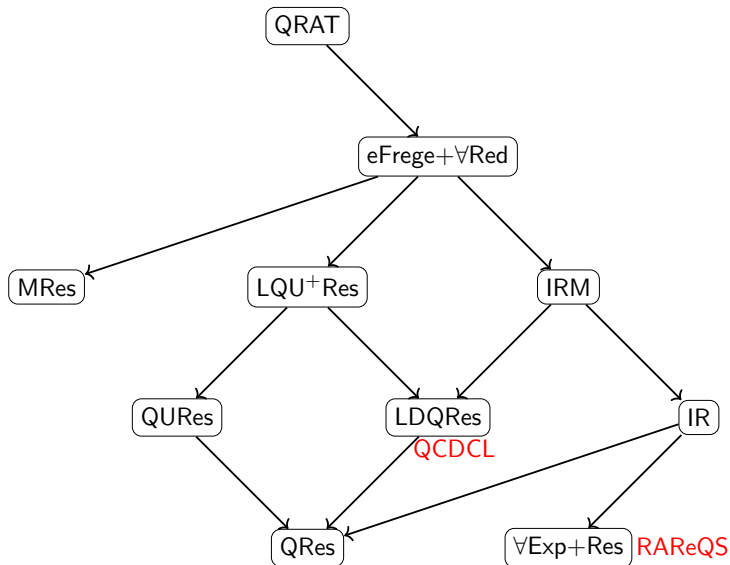
# QBF solving

- Expansion-based solvers
- Extending CDCL:
  - decision order policy
  - reduction policy
  - propagation policy
  - conflict analysis
  - pre-processing
- Dependency Schemes
- Dependency Learning
- ...

# QBF Proof Systems and Solvers



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# Q-CDCL: Some surprises? distractions?

- Evaluating QBF as a 2-player game: inherently sequential. Hence Level-Order for decisions reasonable.  
But proof-theoretically, Any-Order is also sound.



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- Solvers don't know a priori whether input is true or false. Treat every assignment as a conflict – either for  $P_{\exists}$  or for  $P_{\forall}$ . Learn clauses or cubes. Use cubes too in trails.  
(Suggested Nomenclature: CDL – Conflict-Driven Learning. Conflict-Driven Clause Learning and Conflict-Driven Cube Learning.)  
For false(true) QBFs, learning clauses (cubes) suffices.  
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For false(true) QBFs, learning clauses (cubes) suffices.  
**But learning cubes (clauses) can shorten runs.**
- Dependency schemes never lengthen, and can shorten, proofs.  
But in the QCDCL proof system formalising runs of solvers (with  
level-ordered decisions) on false QBFs, not always so –  
**Using / avoiding dependency schemes gives incomparable systems.**

# Questions

- Can solvers based on general “QCDCL proof systems” actually be implemented?
- Can solvers based on other QBF proof systems actually be implemented?
- What proof systems characterise the heuristics in determined QCDCL-style solvers?
- How can Dependency Learning be captured in a proof system?

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?	?	EXP	$\implies$ EXP=PSPACE collapsing time to space; removing alternation in space

# Multiparty games, DQBF, NEXP

- NP: one-player games; SAT
- PSPACE: (bounded) two-player games; QBF
- NEXP: multiplayer-games; DQBF (Dependency QBFs)
- 

$$\forall x_1 \forall x_2 \dots \forall x_n \exists y_1(S_1) \exists y_2(S_2) \dots y_m(S_m) \varphi(x_1, \dots, x_n, y_1, \dots, y_m)$$

- Proof systems for DQBF: Augment&Lift QBF proof systems. **How?**  
Expansion-based systems work.  
For many reduction-based systems, either soundness or completeness breaks down.
- Are DQBF solvers for real?!

# Questions

- Succinct proofs?
- Proof systems/Solvers for fragments of NEXP?
- QBF proof systems by restricting DQBF/NEXP-style systems rather than augmenting PPS?
- Appropriate formulations of proof-search?

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# Some Directions

- (More) Lower bounds for (more) QBF proof systems
- Understanding QBF solvers better
- “Uniformly” generating partial strategies - can proof complexity help?
- QBFs for optimisation - underlying proof systems
- DQBF solvers and proof systems