

# Solving QBF with Counterexample Guided Refinement

**Mikoláš Janota**<sup>1</sup> William Klieber<sup>2</sup>  
Joao Marques-Silva<sup>1,3</sup> Edmund Clarke<sup>2</sup>

<sup>1</sup> INESC-ID/IST, Lisbon, Portugal

<sup>2</sup> Carnegie Mellon University, Pittsburgh, PA, USA

<sup>3</sup> CASL/CSI, University College Dublin, Ireland

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- an extension of SAT with quantifiers
- PSPACE-complete
- formal verification
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- we consider **prenex** form with **maximal blocks** of variables

$$QX_1 \bar{Q}Y_1 QX_2 \bar{Q}Y_2 \dots \phi$$

$$\text{where } Q \in \{\exists, \forall\}$$

$$\bar{\exists} = \forall, \bar{\forall} = \exists$$

## A QBF as a Game

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- universal player wins when the matrix becomes false
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### Example

$$\forall y_1 y_2 \exists x_1 x_2. (y_1 \leftrightarrow x_1) \wedge (y_2 \leftrightarrow x_2)$$

- $\exists$  always wins by playing  $x_1 = y_1, x_2 = y_2$

## Semantics with Winning Move

winning move, **base case**  $QX.\phi$ , for  $\phi$  propositional

- for  $Q = \exists$ , an assignment that makes  $\phi$  **true** (model of  $\phi$ )
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**countermove**, for  $QX.\Phi$ , for  $\Phi$  QBF

- an assignment  $\mu$  is a **countermove** to the assignment  $\tau$  if  $\mu$  is a winning move for  $\bar{Q}$  for  $\Phi[\tau]$

# Winning Move Semantics

## QBF semantics

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- $\forall X.\Phi$  is **false** if and only if there is a winning move for  $\forall$

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## Example

$$\forall y \exists x. x \wedge (y \vee \bar{x})$$

- $\{\bar{y}\}$  is a winning move for  $\forall$ , formula is false
- $\{y\}$  is not a winning move and  $\{x\}$  is a countermove

## Computing a Winning Move—Base Case

---

**Solve** (  $\exists X. \phi$  ), where  $\phi$  is a propositional

**output** : a winning move for  $\exists$  if there is one; **NULL**  
otherwise

**return** **SAT**( $\phi$ )

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## Naive Algorithm for a Winning Move

```
1 Function Solve ( $QX. \Phi$ )
2  $\Lambda \leftarrow \{\text{true}, \text{false}\}^X$            // consider all assignments
3 while true do
4   if  $\Lambda = \emptyset$  then
5     | return NULL           // all assignments used up
6      $\tau \leftarrow \text{pick}(\Lambda)$        // pick a candidate solution
7      $\mu \leftarrow \text{Solve}(\Phi[\tau])$      // find a countermove
8     if  $\mu = \text{NULL}$  then
9       | return  $\tau$            // winning move
10     $\Lambda \leftarrow \Lambda \setminus \{\tau\}$  // remove bad candidate
11 end
```

# Removing More Than One Candidate at a Time

## Observation

- The naive algorithm does not avail of the countermove



# Removing More Than One Candidate at a Time

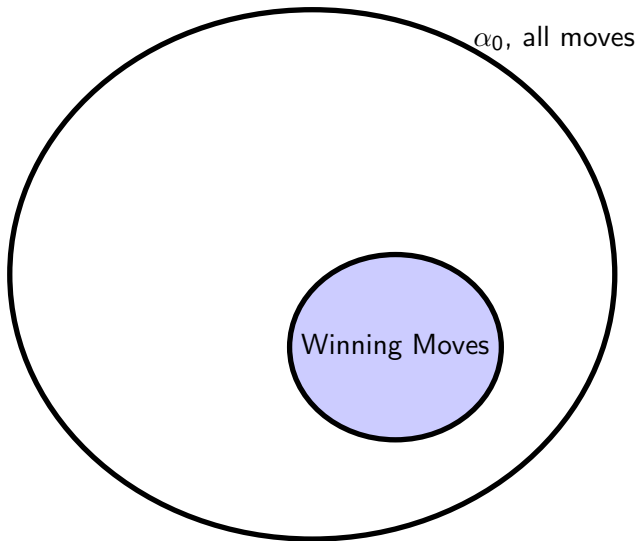
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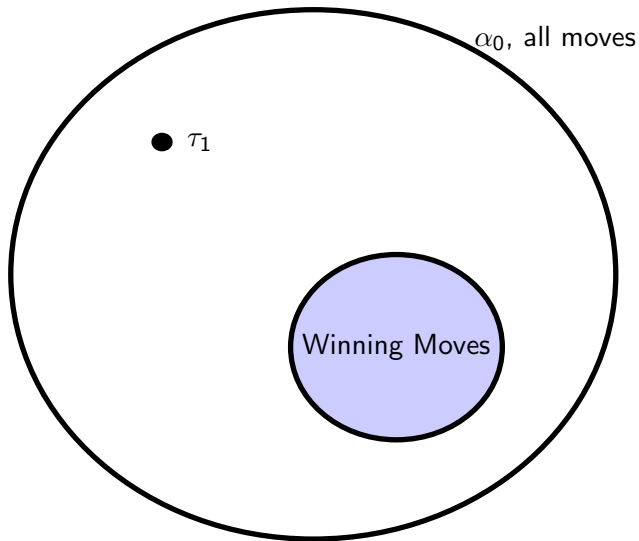
## How?

- represent the set of considered candidates as the set of winning moves of a (simpler) QBF (**abstraction**)
- each time a countermove is found, strengthen the abstraction so that the same countermove cannot be used in the future (**refinement**)

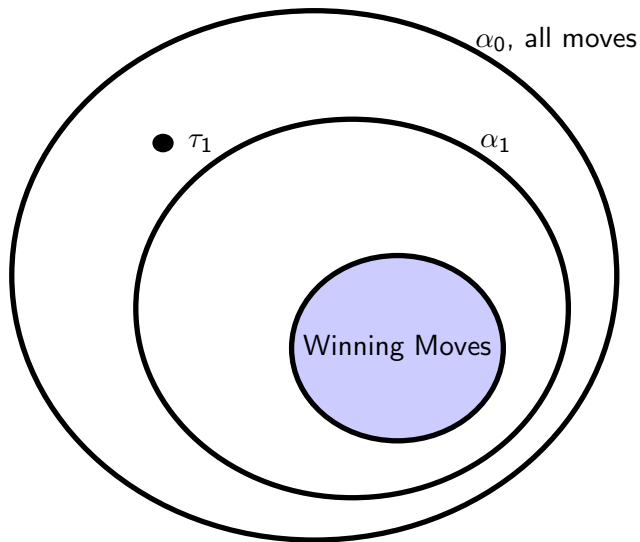
# CounterExample Guided Abstraction Refinement (CEGAR)



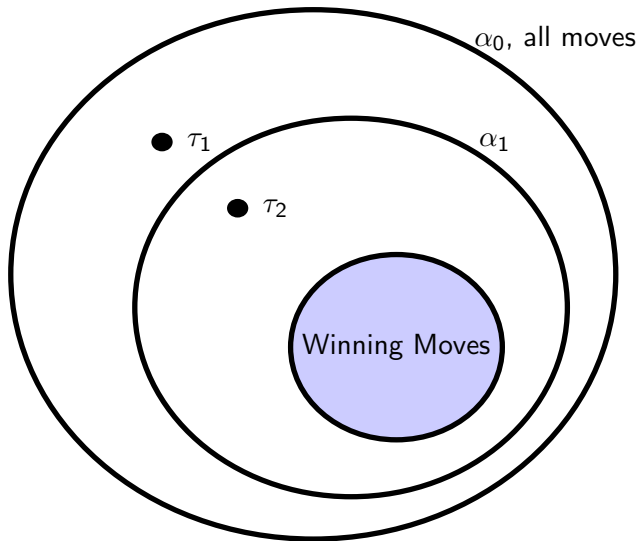
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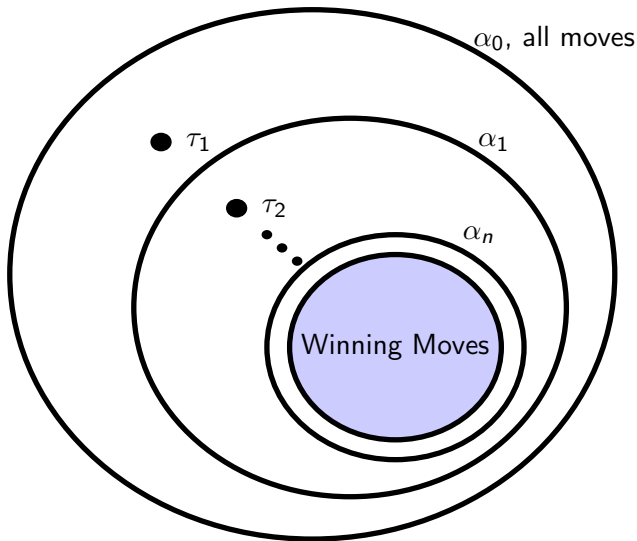
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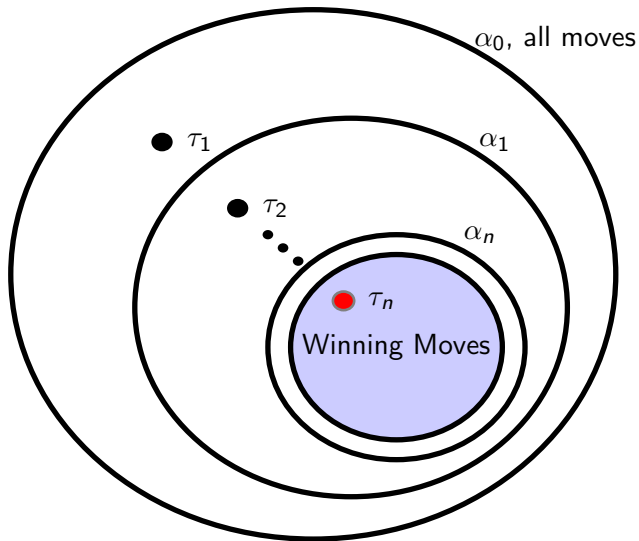
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# Refinement

for a bad candidate  $\tau$

- $\bar{Q}$  wins by  $\mu$ , i.e.  $QX\bar{Q}Y$ .  $\Phi[\tau][\mu]$  is losing for  $Q$



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for a set of countermoves  $\omega = \{\mu_1, \dots, \mu_n\}$

- $\bigwedge_{\mu \in \omega} \Phi[\mu]$ ,  $Q = \exists$
- $\bigvee_{\mu \in \omega} \Phi[\mu]$ ,  $Q = \forall$

## Refinement—Example

- $\forall y \exists x. x \wedge (y \vee \bar{x})$
- candidate:  $\{y\}$ , countermove:  $\{x\}$
- abstraction:  $\forall y. y$   
(with the single winning move  $\{\bar{y}\}$ )

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- abstraction:  $\forall y_1 y_2. y_1 \vee y_2$   
(with the single winning move  $\{\bar{y}_1, \bar{y}_2\}$ )

# Abstraction-Based Algorithm for a Winning Move

```
1 Function Solve ( $QX. \Phi$ )
2 begin
3   if  $\Phi$  has no quant then
4     | return ( $Q = \exists$ ) ? SAT( $\phi$ ) : SAT( $\neg\phi$ )
5      $\omega \leftarrow \emptyset$ 
6     while true do
7       |  $\alpha \leftarrow (Q = \exists) ? \bigwedge_{\mu \in \omega} \Phi[\mu] : \bigvee_{\mu \in \omega} \Phi[\mu]$  // abstraction
8       |  $\tau' \leftarrow \text{Solve}(\text{Prenex}(QX. \alpha))$  // find a candidate
9       | if  $\tau' = \text{NULL}$  then return NULL // no winning move
10      |  $\tau \leftarrow \{l \mid l \in \tau' \wedge \text{var}(l) \in X\}$  // filter a move for X
11      |  $\mu \leftarrow \text{Solve}(\Phi[\tau])$  // find a countermove
12      | if  $\mu = \text{NULL}$  then return  $\tau$  // winning move
13      |  $\omega \leftarrow \omega \cup \{\mu\}$  // refine
14   end
15 end
```



## Results

- **RAReQS** implementation of the above using minisat2.2

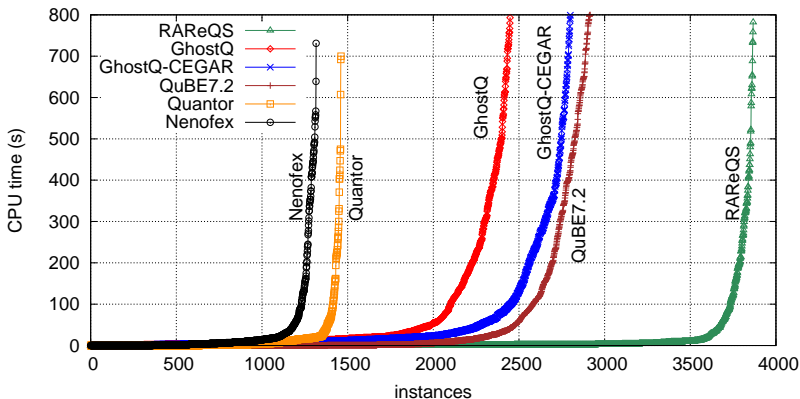
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Results for planning and Formal Verification families



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(220 instances that only RAReQS solved)

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- in RAReQS we plan to investigate how to integrate techniques used in other solvers (e.g. dependency detection)

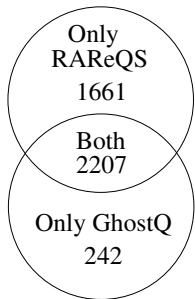
Questions?

# Results

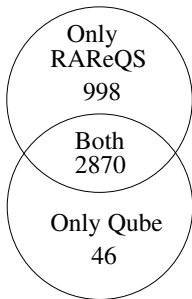
Total instances solved (out of 4669):

RAReQS	GhostQ	GhostQ-C	Qube	Quantor	Nenofex
3868	2449	2801	2916	1462	1317

RAReQS vs GhostQ



RAReQS vs Qube



RAReQS vs Quantor

