## ON CONFLICTS AND STRATEGIES IN QBF

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- an extension of SAT with quantifiers


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- we consider prenex form with maximal blocks of variables

$$
\forall \mathcal{U}_{1} \exists \mathcal{E}_{2} \ldots \forall \mathcal{U}_{2 N-1} \exists \mathcal{E}_{2 N \cdot} \cdot \phi
$$

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$\exists$ wins by playing $e \leftarrow \neg u$.

## SETUP

- Two types of solving:
expansion [Janota et al., 2012] and conflict-driven (DPLL) [Zhang and Malik, 2002].
- Both approaches have their weaknesses [Beyersdorff et al., 2015].
-What is a good way of combining them?


## EXPANSION BY STRATEGIES

Consider $\forall x$. $\phi$

- traditional expansion [Janota et al., 2012] abstract as: $\left.\bigwedge_{c \in \omega} \phi\right|_{x=c}$ where $\omega \subseteq\{0,1\}$
- strategy expansion abstract as: $\left.\bigwedge_{f \in \omega} \phi\right|_{x=f}$ where $\omega \subseteq \operatorname{dom}(X) \rightarrow \mathbb{B}$
E.g. $\exists e \forall u .(u \Leftrightarrow e)$, expand with $u \triangleq \neg e$. Simplifies to false.


## WHERE TO GET STRATEGIES?



## HOW TO GET STRATEGIES FROM CONFLICTS?

## (In Q-Resolution)

$$
\begin{gathered}
\frac{C \vee u \in \phi}{C \vee u:(u \leftarrow 0)} \\
\frac{C \vee \bar{u} \in \phi}{C \vee \bar{u}:(u \leftarrow 1)} \\
\frac{C \in \phi}{C:(u \leftarrow \star)} u, \bar{u} \notin C \\
\frac{C_{1} \vee x:\left(u \leftarrow f_{1}\right) \quad C_{2} \vee \bar{x}:\left(u \leftarrow f_{2}\right)}{C_{1} \vee C_{2}:\left(u \leftarrow x ? f_{2}: f_{1}\right)}
\end{gathered}
$$

## COMBINED QBF SOLVING

$1 \delta \leftarrow \emptyset$
$2 \alpha \leftarrow\left[\alpha_{1}=\right.$ true $, \ldots, \alpha_{n}=$ true $]$
// initialization of decisions
// initialization
3 while true do
$4 \quad(\tau$, loser $) \leftarrow$ Propagate $(\delta, \Phi)$
// propagation

$$
\text { if } \tau=\perp \text { then // conflict resolution }
$$

$(k, \alpha, \Phi) \leftarrow$ LearnAndRefine $(\delta, \Phi, \alpha$, loser $)$
if $k=\perp$ then return (loser $=\forall$ ) ? true : false
$\delta \leftarrow\{l \in \delta \mid$ qlevel $(l)<k\} \quad / /$ backtrack decisions
else // decision-making
$k \leftarrow$ minimal quantification level not fully assigned in $\tau$
$\tau_{k} \leftarrow\{\ell \in \tau \mid$ qlevel $(\ell) \leq k\}$
// filtering
$\left(\mu, \tau^{\prime}\right) \leftarrow \mathbf{S A T}\left(\alpha_{k} \wedge \tau_{k}\right)$
// consult $\alpha_{k}$
if $\mu=\perp$ then // abstraction unsatisfiable
$\Phi \leftarrow \operatorname{ResolveUnsat}\left(\tau^{\prime}, Q_{k}, \Phi\right) \quad / /$ update $\Phi$
if $\Phi=\perp$ then return $\left(Q_{k}=\forall\right)$ ? true : false
else
$v \leftarrow$ a variable unassigned by $\tau$ at quantification level $k$
$\delta \leftarrow \delta \cup\{\mu(v) ? v: \neg v\} \quad / /$ make a decision on $v$

## EXPERIMENTS EVAL 2012

$$
\begin{aligned}
& \triangle \text { qosta }-\square \text { qosta-noref } \rightarrow \text { rareqs } \\
& \neg \text { depqbf }- \text { ghostq }
\end{aligned}
$$



## EXPERIMENTS 2QBF



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- construction of strategies from DPLL conflicts
- enables combining DPLL and expansion
- different applications of strategies? (prediction of the opponent)
- better ways how to come up with strategies?
- combining strategies?


# Thank You for Your Attention! 

## Questions?

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