

Quantifier Elimination Via Clause Redundancy

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FMCAD-2013, October 20-23,
Portland, OR, USA

Outline

- **Introduction**
- Clause D-sequents
- Example
- Experimental results
- Conclusions

Quantifier Elimination (QE)

Let F be a Boolean CNF formula and $X \subseteq \text{Vars}(F)$.

QE problem:

Given $\exists X[F]$, find a quantifier free CNF formula G such that $G \equiv \exists X[F]$

$G \equiv \exists X[F]$ means that $G_s = \exists X[F_s]$

for every complete assignment s to $\text{Vars}(F) \setminus X$

QE is important in many areas e.g model checking

SAT-based QE Methods

- **Enumeration of satisfying assignments:**

McMillan 2002, Ganai, Gupta, Ashar 2004,
Jin, Somenzi 2005, Brauer, King, Kriener 2011

- **Variable elimination:**

Davis, Putnam 1960, Jiang 2009, Goldberg, Manolios 2010

- **Computing redundancy of variables**

Goldberg, Manolios 2012

Three Ideas of Our Method

- 1) **Add resolvent-clauses** to F until clauses with variables of X (X -clauses) are **redundant** in $\exists X[H]$, $H \supseteq F$

Redundancy of X -clause C means $\exists X[H] \equiv \exists X[H \setminus \{C\}]$

- 2) **Use branching** to prove redundancy of X -clauses in subspaces and merge results of different branches

- 3) **Compute termination condition:** (all X -clauses are redundant in $\exists X[H]$). This is done by machinery of dependency sequents (D-sequents)

Clause And Variable Redundancy

D-sequents based on **redundancy of variables** (FMCAD-12)

A variable $v \in X$ is redundant in $\exists X[F]$

if the clauses of F with v are redundant in $\exists X[F]$

D-sequents based on **clause redundancy** (FMCAD-13)

- Clause D-sequents can express redundancy of **any subset of X -clauses**
- Derivation of termination condition in terms of **clause D-sequents** cannot be simulated by **variable D-sequents**

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Clause Dependency Sequents (D-sequents)

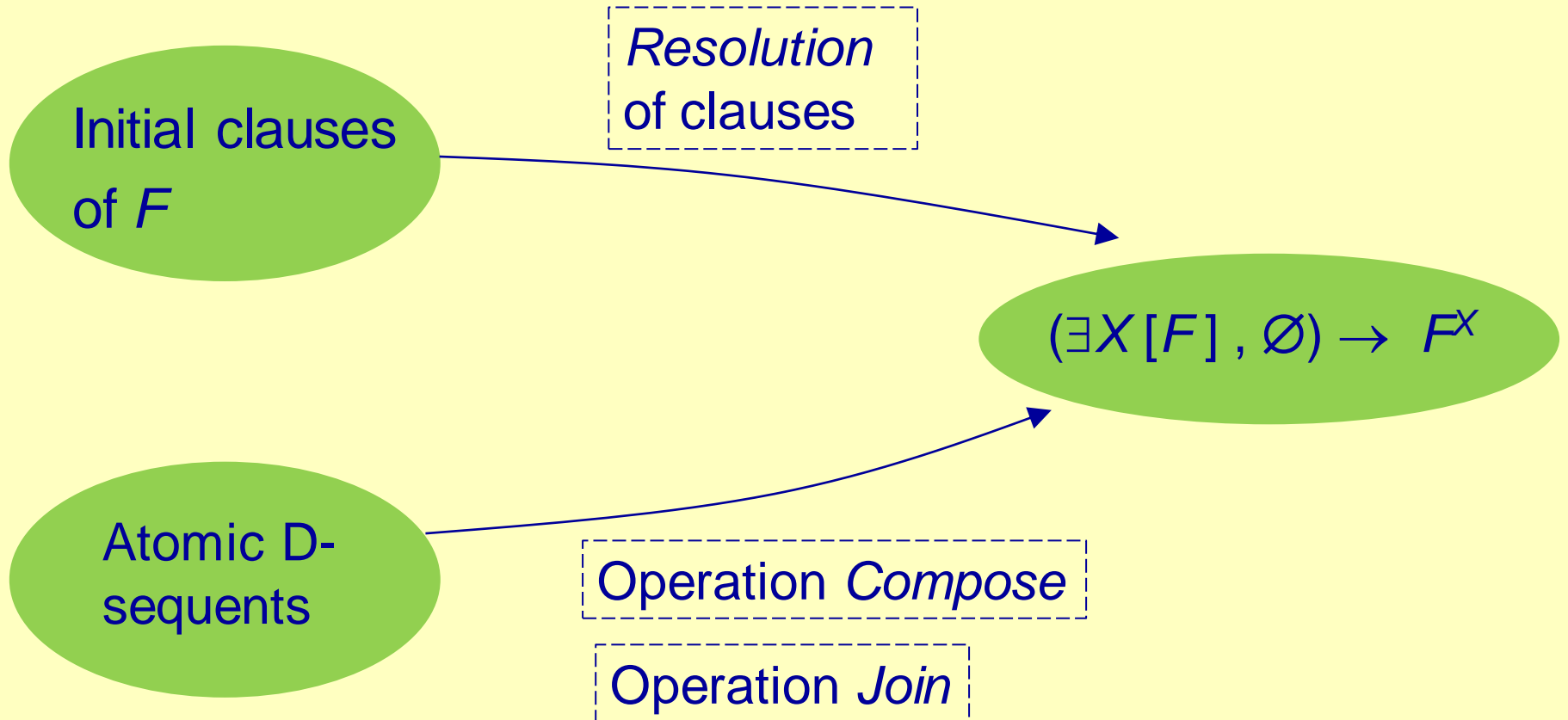
Let \mathbf{s} be a partial assignment to $\text{Vars}(F)$.

Let F^X denote the X -clauses of $\exists X[F]$

A clause D-sequent $(\exists X[F], \mathbf{s}) \rightarrow R$, where $R \subseteq F^X$
states that R is redundant in $\exists X[F_s]$.

We will call \mathbf{s} the **conditional part** of the D-sequent

D-Sequent Calculus



Atomic D-sequents

Let C be an X -clause of $\exists X[F]$,

Atomic D-sequent $(\exists X[F], \mathbf{s}) \rightarrow \{C\}$

is derived when C is



satisfied

by \mathbf{s}



subsumed

by $C' \in F_s$



blocked

(cannot be resolved
with clauses of F_s)

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A Run of DCDS on a Simple Formula

Derivation of Clause D-Sequents (DCDS)

Consider $\exists x [F]$ where

$$F = C_1 \wedge C_2,$$

$$C_1 = \sim y_1 \vee x,$$

$$C_2 = y_2 \vee \sim x,$$

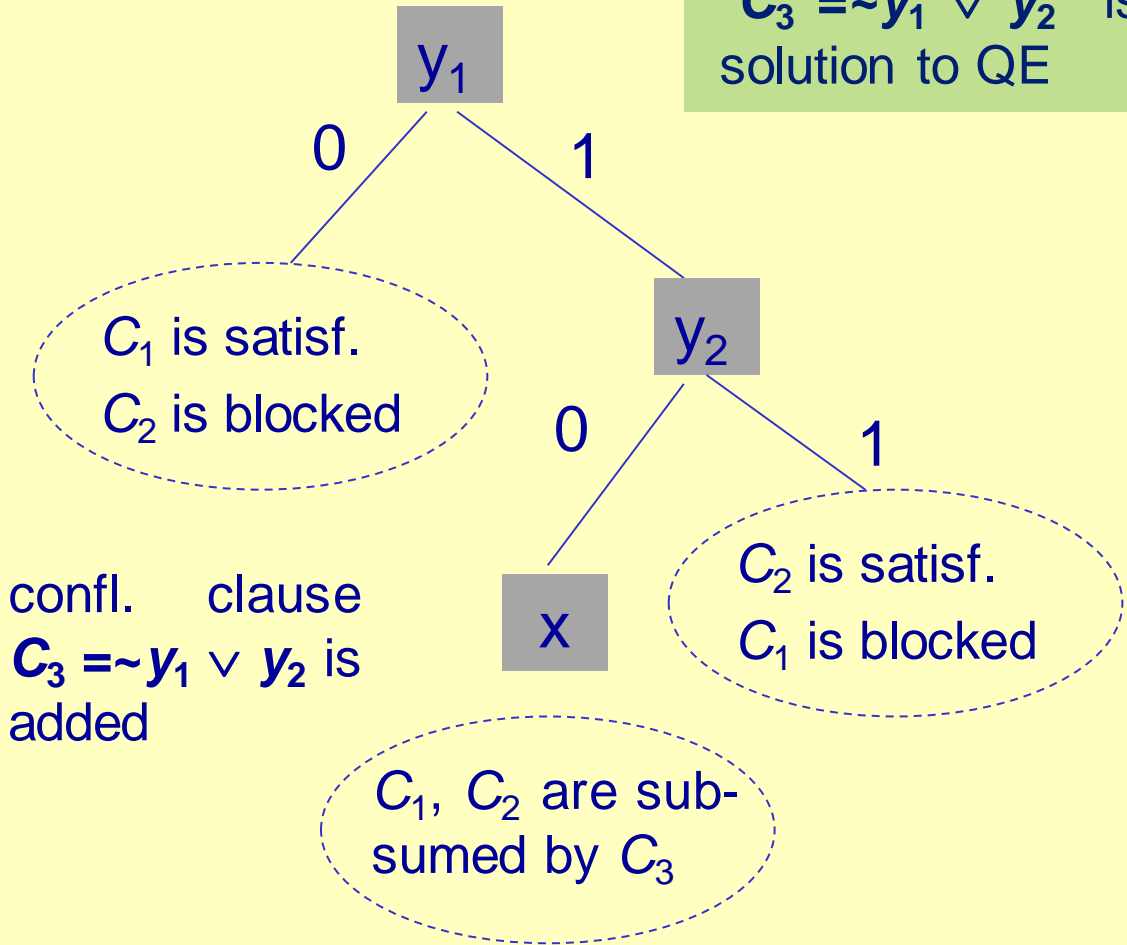
$\sim y_1 \vee y_2$ is a **solution** to the QE problem i.e.

$$\sim y_1 \vee y_2 \equiv \exists x (\sim y_1 \vee x) \wedge (y_2 \vee \sim x)$$

Decision Tree Built by DCDS

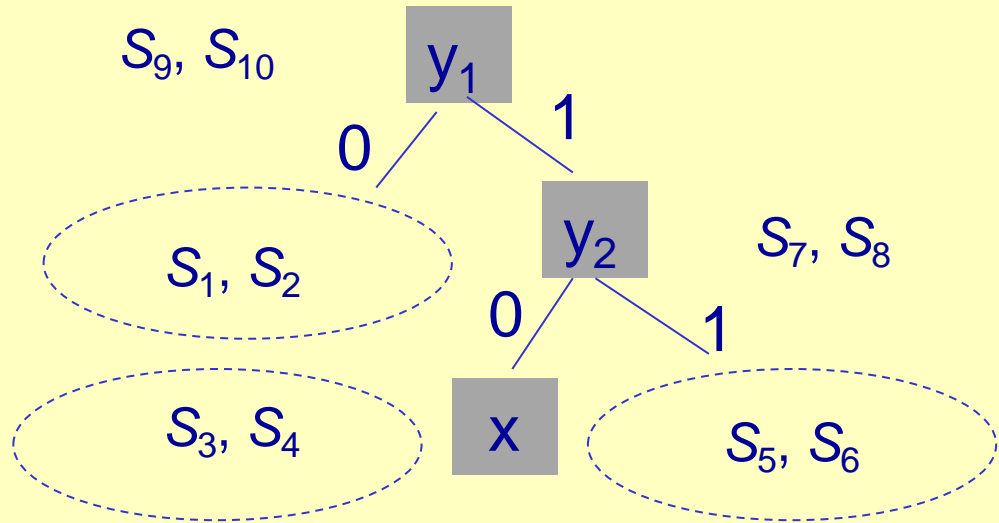
$\exists x[F],$
 $F = C_1 \wedge C_2,$
 $C_1 = \sim y_1 \vee x,$
 $C_2 = y_2 \vee \sim x,$

$C_3 = \sim y_1 \vee y_2$ is a solution to QE



D-sequents Built by DCDS

$$\begin{aligned} \exists x[F], \\ F = C_1 \wedge C_2, \\ C_1 = \sim y_1 \vee x, \\ C_2 = y_2 \vee \sim x, \end{aligned}$$



Join operation:

$$S_3: (y_1 = 1, y_2=0) \rightarrow \{C_1\},$$

$$S_5: (y_2 = 1) \rightarrow \{C_1\},$$

$$S_7: (y_1 = 1) \rightarrow \{C_1\},$$

$$S_1: (y_1 = 0) \rightarrow \{C_1\}, \quad S_2: (y_1 = 0) \rightarrow \{C_2\}$$

$$S_3: (y_1 = 1, y_2=0) \rightarrow \{C_1\}, \quad S_4: (y_1 = 1, y_2=0) \rightarrow \{C_2\}$$

$$S_5: (y_2 = 1) \rightarrow \{C_1\}, \quad S_6: (y_2 = 1) \rightarrow \{C_2\}$$

$$S_7: (y_1 = 1) \rightarrow \{C_1\}, \quad S_8: (y_1 = 1) \rightarrow \{C_2\}$$

$$S_9: \emptyset \rightarrow \{C_1\}, \quad S_{10}: \emptyset \rightarrow \{C_2\}$$

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Re-using D-sequents

- Current implementation of DCDS lacks a few optimizations
- Most importantly, D-sequents are not re-used
- Parent D-sequents are discarded after a join operation
- Re-using D-sequents should drastically boost performance

Backward Model Checking

758 benchmarks of HWMCC-10. Time limit is 2,000 s.

We compared three algorithms:

- **MC-DDS** is based on our QE algorithm of FMCAD-12
- **MC-DCDS** is based on our QE algorithm of FMCAD-13
- **MC-BDD** is based on PdTrav

Model checker	MC-DDS	MC-DCDS	MC-BDD
Solved	247	258	374

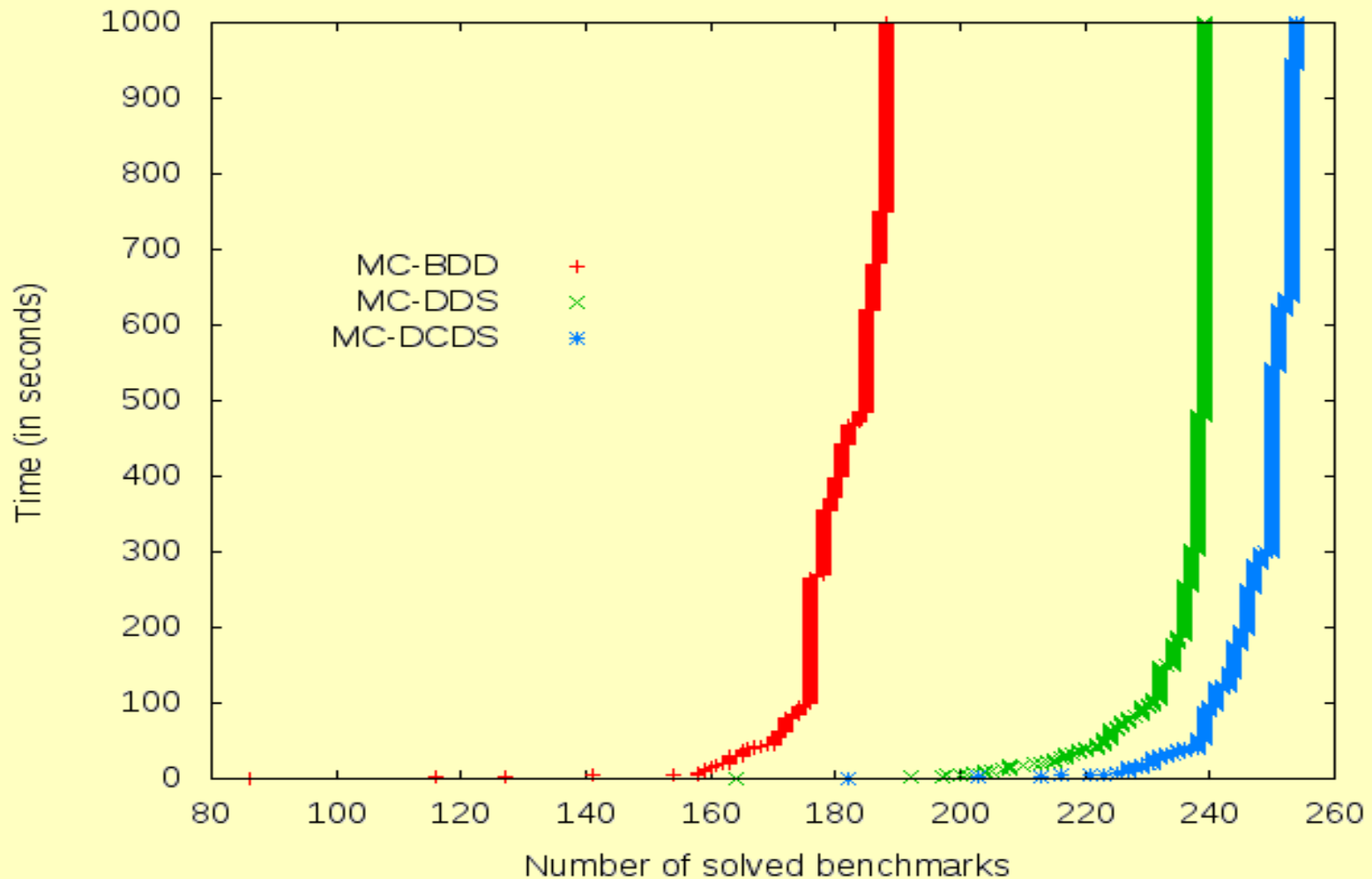
Comparison On Benchmarks Solved by MC-DDS or MC-DCDS

Number of benchmarks is 259

Time limit is 2,000 s.

Model checker	MC-DDS	MC-DCDS	MC-BDD
Solved	247	258	193
#timeouts	12	1	66
Time for solved by all (s.)	11,293	1,698	9,080

Cactus Plots For Benchmarks Solved by MC-DDS or MC-DCDS



Conclusions

- We introduced the machinery of clause D-sequents that can be used in many applications
- We showed how it works for quantifier elimination
- A model checker based on clause D-sequents can solve examples that are hard for BDDs
- We are still at the stage where adding a new technique (e.g. re-using D-sequents) can lead to drastic improvements