CS 433 Automated Reasoning 2022

Lecture 9: Theory of equality and uninterpreted functions (QF_EUF)

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Topic 9.1

Theory of equality and function symbols (EUF)

Reminder: Theory of equality and function symbols (EUF)

EUF syntax: first-order formulas with signature $\mathbf{S} = (\mathbf{F}, \emptyset)$,
i.e., countably many function symbols and no predicates.

The theory axioms include

1. $\forall x.\ x = x$
2. $\forall x, y.\ x = y \Rightarrow y = x$
3. $\forall x, y, z.\ x = y \wedge y = z \Rightarrow x = z$
4. for each $f/n \in \mathbf{F}$, $\forall x_1, .., x_n, y_1, .., y_n.\ x_1 = y_1 \wedge .. \wedge x_n = y_n \Rightarrow f(x_1, .., x_n) = f(y_1, .., y_n)$

Note: Predicates can be easily added if desired

Commentary: Since the axioms are valid in FOL with equality, the theory is sometimes referred as the base theory.

Proofs in quantifier-free fragment of $\mathcal{T}_{EUF}$ (QF_EUF)

The axioms translates to the proof rules of $\mathcal{T}_{EUF}$ as follows

$$\frac{x = y}{y = x} \text{Symmetry} \qquad \frac{x = y \quad y = z}{x = z} \text{Transitivity} \qquad \frac{x_1 = y_1 \quad .. \quad x_n = y_n}{f(x_1, .., x_n) = f(y_1, .., y_n)} \text{Congruence}$$

Example 9.1

Consider: $y = x \land y = z \land f(x, u) \neq f(z, u)$

$$\frac{\dfrac{\dfrac{y = x}{x = y} \quad y = z}{\dfrac{x = z}{f(x, u) = f(z, u)}} \quad f(x, u) \neq f(z, u)}{\bot}$$

Commentary: Proof rules capture the intention of axioms. The rules are complete, i,e., they allow you to prove $F \models_{EUF} G$ for any F and G if it holds.

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Exercise: equality with uninterpreted functions

Exercise 9.1
If unsat, give proof of unsatisfiability

- ▶ $f(f(c)) \neq c \wedge f(c) = c$
- ▶ $f(f(c)) = c \wedge f(c) \neq c$
- ▶ $f(f(c)) = c \wedge f(f(f(c))) \neq c$
- ▶ $f^3(a) = a \wedge f^5(a) = a \wedge f(a) \neq a$

Topic 9.2

QF_EUF solving via SAT solver

Eager solving

Explicate all the theory reasoning as Boolean clauses.

Use SAT solver alone to check satisfiability.

Only possible for the theories, where we can bound the relevant instantiations of the theory axioms.

The eager solving for QF_EUF is called Ackermann's Reduction.

Notation: term encoder

Let *en* be a function that maps terms to new constants.

We can apply *en* on a formula to obtain a formula over the fresh constants.

Example 9.2
Consider $en = \{f(x) \mapsto t_1, f(y) \mapsto t_2, x \mapsto t_3, y \mapsto t_4\}$.

$en(x = y \Rightarrow f(x) = f(y)) = (t_3 = t_4 \Rightarrow t_1 = t_2)$

Notation: Boolean encoder

For a formula F, let boolean encoder e be a partial map from $atoms(F)$ to fresh boolean variables.

Definition 9.1
For a formula F, let $e(F)$ denote the term obtained by replacing each atom a by $e(a)$ if $e(a)$ is defined.

Example 9.3
Consider $e = \{t_3 = t_4 \mapsto p_1, t_1 = t_2 \mapsto p_2\}$

$e(t_3 = t_4 \Rightarrow t_1 = t_2) = (p_1 \Rightarrow p_2)$

Ackermann's Reduction

The insight: the rules needed to be applied only finitely many possible ways.

Algorithm 9.1: QF_EUF_Sat(F)

Input: F formula QF_EUF
Output: SAT/UNSAT
Let Ts be subterms of F, *en* be $Ts \rightarrow$ fresh constants, *e* be a Boolean encoder;
$G := en(F)$;
foreach $f(x_1, .., x_n), f(y_1, .., y_n) \in Ts$ **do**

> $G := G \wedge en(x_1 = y_1 \wedge .. \wedge x_n = y_n \Rightarrow f(x_1, .., x_n) = f(y_1, .., y_n))$

foreach $t_1, t_2, t_3 \in Ts$ **do**

> $G := G \wedge en(t_1 = t_2 \wedge t_2 = t_3 \Rightarrow t_1 = t_3)$

foreach $t_1, t_2 \in Ts$ **do**

> $G := G \wedge en(t_1 = t_2 \Leftrightarrow t_2 = t_1)$

$G' := e(G)$;
return CDCL(G')

Exercise 9.2

Can we avoid clauses for the symmetry rule?

Example: Ackermann's Reduction

Example 9.4

Consider formula $F = f(f(x)) \neq x \land f(x) = x$
$Ts := \{f(f(x)), f(x), x\}$.

$en := \{f(f(x)) \mapsto f_1, f(x) \mapsto f_2, x \mapsto f_3\}$

$G := en(F) := f_1 \neq f_3 \land f_2 = f_3$

Adding congruence consequences:
$G := G \land (f_2 = f_3 \Rightarrow f_1 = f_2)$.

Adding transitivity consequences:
$G := G \land (f_1 = f_2 \land f_2 = f_3 \Rightarrow f_1 = f_3)$
$\land (f_1 = f_3 \land f_2 = f_3 \Rightarrow f_1 = f_2)$
$\land (f_1 = f_2 \land f_1 = f_3 \Rightarrow f_2 = f_3)$.

> Assumed that symmetric atoms mapped to same variable.

Boolean encoding:
$\{f_1 = f_3 \mapsto p_1, f_2 = f_3 \mapsto p_2, f_1 = f_2 \mapsto p_3\}$

$G' := \neg p_1 \land p_2$

$G' := G' \land (p_2 \Rightarrow p_3)$.

$G' := G' \land (p_3 \land p_2 \Rightarrow p_1) \land (p_3 \land p_2 \Rightarrow p_1)$
$\land (p_1 \land p_3 \Rightarrow p_2)$.

Since G' is UNSAT, F is UNSAT.

Other eager encoding

Byrant's Encoding is another method of encoding EUF formulas into a SAT problem.

Exercise 9.3
How Byrant's Encoding encoding work?

Topic 9.3

Lazy QF_EUF solver

Eager is too eager

▶ Eager solver wastefully instantiates too many clauses

▶ Eager solvers do not scale

Exercise 9.4
What is the size blow up in the Ackermann's reduction?

Lazy incremental solver

Lazy: axioms are applied on demand

Incremental: one literal is consider at a time.

Solver applies axioms only related to the literals.

> Lazy solver handles only conjunction of literals. For full QF_EUF, we will integrate lazy solver with CDCL.

Algorithm 9.2: *LazyEUF*(Conjunction of EUF literals F)

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globals: bool *conflictFound* := 0 // modified inside *IncrEUF*
foreach $t_1 \bowtie t_2 \in F$ **do**
    IncrEUF($t_1 \bowtie t_2$);
    if *conflictFound* **then**
        return unsat;

return sat;

IncrEUF

General idea: maintain equivalence classes among terms

Algorithm 9.3: $IncrEUF(t_1 \bowtie t_2)$

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globals: set of terms $Ts := \emptyset$, set of pairs of classes $DisEq := \emptyset$, bool $conflictFound := 0$

$Ts := Ts \cup subTerms(t_1) \cup subTerms(t_2)$;

$C_1 := getClass(t_1)$; $C_2 := getClass(t_2)$; // if t_i is seen first time, create new class

if $\bowtie \, = \, "="$ **then**

    if $C_1 = C_2$ **then** return ;

    if $(C_1, C_2) \in DisEq$ **then** $\{ conflictFound := 1;$ **return**; $\}$;

    $C := mergeClasses(C_1, C_2)$; $parent(C) := (C_1, C_2, t_1 = t_2)$;

    $DisEq := DisEq[C_1 \mapsto C, C_2 \mapsto C]$

else

    $DisEq := DisEq \cup (C_1, C_2)$; // $\bowtie \, = \, "\neq"$

    if $C_1 = C_2$ **then** $conflictFound := 1$; **return** ;

foreach $f(r_1, \ldots, r_n), f(s_1, \ldots, s_n) \in Ts \wedge \forall i \in 1..n. \, \exists C. \, r_i, s_i \in C$ **do**

    $IncrEUF(f(r_1, \ldots, r_n) = f(s_1, \ldots, s_n))$;

Exercise 9.5

Can we drop the condition $f(r_1, \ldots, r_n), f(s_1, \ldots, s_n) \in Ts$?

Example: push

Example 9.5

Consider input $f(f(x)) \neq x \wedge f(x) = x$

- ▶ *$IncrEUF(f(f(x)) \neq x)$*
  - ▶ *term set $Ts = \{x, f(x), f(f(x))\}$*
  - ▶ *classes $C_1 = \{f(f(x))\}$, and $C_2 = \{x\}$*
  - ▶ *$DisEq = \{(C_1, C_2)\}$*

- ▶ *$IncrEUF(f(x) = x)$*
  - ▶ *classes $C_1 = \{f(f(x))\}$, $C_2 = \{x\}$, and $C_3 = \{f(x)\}$*
  - ▶ *$C_4 = mergeClasses(C_2, C_3)$: classes $C_1 = \{f(f(x))\}$, $C_4 = \{f(x), x\}$*
  - ▶ *$DisEq = \{(C_1, C_4)\}$*
  - ▶ *Apply congruence on function f and terms of C_4*
    - ▶ *Triggers recursive call $IncrEUF(f(f(x)) = f(x))$*

- ▶ *$IncrEUF(f(f(x)) = f(x))$*
  - ▶ *Since $(C_1, C_4) \in DisEq$, conflictFound $= 1$ and exit*

Topic 9.4

Completeness of *IncrEUF*

Completeness is not obvious

Example 9.6

Consider: $x = y \wedge y = z \wedge f(x, u) \neq f(z, u)$

$$\dfrac{\dfrac{x = y}{f(x, u) = f(y, u)} \quad \dfrac{y = z}{f(y, u) = f(z, u)}}{\dfrac{f(x, u) = f(z, u)}{\bot} \qquad f(x, u) \neq f(z, u)}$$

In the proof $f(y, u)$ occurs, which does not occur in the input formula.

Commentary: Our algorithm only derives facts consists of terms that occur in the input. If the above proof exists, does it endanger the completeness of *IncrEUF*?

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Completeness of *IncrEUF*

Theorem 9.1
Let $\Sigma = \{\ell_1, .., \ell_n\}$ be a set of literals in $\mathcal{T}_{EUF}$.
IncrEUF(ℓ_1); ...; IncrEUF(ℓ_n); finds conflict iff Σ is unsat.

Proof.
Since *IncrEUF* uses only sound proof steps of the theory, it cannot find conflict if Σ is sat.

Assume Σ is unsat and there is a proof for it.

Since *IncrEUF* applies congruence only if the resulting terms appear in Σ, we show that there is a proof that contains only such terms.   ...

Completeness of *IncrEUF* (contd.)

Proof(contd.)

Since Σ is unsat, there is $\Sigma' \cup \{s \neq t\} \subseteq \Sigma$ s.t. $\Sigma' \cup \{s \neq t\}$ is unsat and Σ' contains only positive literals.(why?)

Consider a proof that derives $s = t$ from Σ'.

Therefore, we must have a proof step such that

$$\frac{u_1 = u_2 \quad .. \quad u_{n-1} = u_n}{s = t},$$

Flattened transitivity and symmetry rules!!

where $n \geq 2$, the premises have proofs from Σ', $u_1 = s$, and $u_n = t$.   ...

Exercise 9.6

Show that the last claim holds.

Commentary: We can generalize transitivity with more than two premises. $\dfrac{u_1=u_2 \quad u_2=u_3 \quad \cdots \quad u_{n-1}=u_n}{u_1=u_n}$

We may assume that symmetry is not used if we assume $s = t$ is same as $t = s$. We interpret them in either direction as needed.

Completeness of *IncrEUF*(contd.)

Proof(contd.)

Wlog, we assume $u_i = u_{i+1}$ either occurs in Σ' or derived from congruence.

Observation: if $u_i = u_{i+1}$ is derived from congruence then the top symbols are same in u_i and u_{i+1}.

Now we show that we can transform the proof via induction over height of congruence proof steps. ...

Exercise 9.7
Justify the "wlog" claim.

Completeness of *IncrEUF*(contd.)

Proof(contd.)

claim: If s and t occurs in Σ', any proof of $s = t$ can be turned into a proof that contains only the terms from Σ'

base case:

If no congruence is used to derive $s = t$ then no fresh term was invented.(why?)

induction step:

We need not worry about $u_i = u_{i+1}$ that are coming from Σ'.

Only in the subchains of the equalities due to congruences may have new terms. ...

Example 9.7

$$\frac{x = y}{f(x, u) = f(y, u)} \quad \frac{y = z}{f(y, u) = f(z, u)}$$
$$f(x, u) = f(z, u)$$

Completeness of *IncrEUF* (contd.)

Proof(contd.)

Let $f(u_{11}, .., u_{1k}) = f(u_{21}, .., u_{2k})$ .. $f(u_{(j-1)1}, .., u_{(j-1)k}) = f(u_{j1}, .., u_{jk})$ be such a maximal subchain in the last proof step for $s = t$.

$$s = ... \frac{\dfrac{u_{11}=u_{21} \quad .. \quad u_{1k}=u_{2k}}{f(u_{11},..,u_{1k})=f(u_{21},..,u_{2k})} \quad .. \quad \dfrac{u_{(j-1)1}=u_{j1} \quad .. \quad u_{(j-1)k}=u_{jk}}{f(u_{(j-1)1},..,u_{(j-1)k})=f(u_{j1},..,u_{jk})} \quad ... = t}{s = t},$$

We know $f(u_{11}, .., u_{1k})$ and $f(u_{j1}, .., u_{jk})$ occur in Σ'.(why?)

For $1 < i < j$, $f(u_{i1}, .., u_{ik})$ may not occur in Σ'.   ...

Exercise 9.8

Justify the (why?). (Hint: Maximal subchain requirement ensures that either $f(u_{11}, .., u_{1k})$ is s or equality before is not derived by congruence.)

Completeness of *IncrEUF*(contd.)

Proof(contd.)

We can rewrite the proof in the following form.

$$s = ... \quad \cfrac{\cfrac{u_{11}=u_{21} \quad .. \quad u_{(j-1)1}=u_{j1}}{u_{11}=u_{j1}} \quad .. \quad \cfrac{u_{1k}=u_{2k} \quad .. \quad u_{(j-1)k}=u_{jk}}{u_{1k}=u_{jk}}}{f(u_{11},..,u_{1k})=f(u_{j1},..,u_{jk})} \quad ... = t$$
$$s = t$$

Due to induction hypothesis, for each $i \in 1..k$,

since u_{1i} and u_{ji} occur in Σ', $u_{1i} = u_{ji}$ has a proof with the restriction. □

Example 9.8

$$\cfrac{\cfrac{x=y}{f(x,u)=f(y,u)} \quad \cfrac{y=z}{f(y,u)=f(z,u)}}{f(x,u)=f(z,u)} \quad \rightsquigarrow \quad \cfrac{\cfrac{x=y \quad y=z}{x=z}}{f(x,u)=f(z,u)}$$

Topic 9.5

Model generation

Model generation

After running *LazyEUF*, if we have no contradiction then we construct a satisfying model.

▶ Each equivalence class is mapped to a value from the universe of model.

▶ We may assign a value to multiple classes while respecting disequality constraints
  ▶ The problem of finding optimum model reduces into graph coloring problem.(how?)

▶ The models of functions are read from the class value map and their term parent relation.

Example: model generation

Exercise 9.9
Consider formula $f(f(a)) = a \land f(a) \neq a$.

We have terms $Ts = \{f^2(a), f(a), a\}$.

Due to the constraint, we have classes $C_1 = \{f^2(a), a\}$ and $C_2 = \{f(a)\}$.

Since C_1 and C_2 can not be merged, we assign values v_1 and v_2 respectively.

Therefore, we construct model m as follows

- ▶ $D_m = \{v_1, v_2\}$
- ▶ $a = v_1$
- ▶ $f = \{v_1 \mapsto v_2, v_2 \mapsto v_1\}$ *because $f(C_1)$ is going to C_2 and vice versa.*

Topic 9.6

Problems

Hybrid approach

Exercise 9.10
We have seen both lazy and eager approach. How can we have a mixed lasy/eager approach for EUF solving?

WrongIncrEUF

Exercise 9.11

Show that the following implementation is incomplete

Algorithm 9.4: *WrongIncrEUF*$(t_1 \bowtie t_2)$

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globals: set of terms $Ts := \emptyset$, set of pairs of classes $DisEq := \emptyset$, bool $conflictFound := 0$

$Ts := Ts \cup subTerms(t_1) \cup subTerms(t_2)$;

$C_1 := getClass(t_1)$; $C_2 := getClass(t_2)$; // if t_i is seen first time, create new class

if $\bowtie = "="$ **then**

    if $C_1 = C_2$ **then** **return** ;

    if $(C_1, C_2) \in DisEq$ **then** $\{$ $conflictFound := 1$; **return**; $\}$;

    $C := mergeClasses(C_1, C_2)$; $parent(C) := (C_1, C_2, t_1 = t_2)$;

    $DisEq := DisEq[C_1 \mapsto C, C_2 \mapsto C]$;

    foreach $f(r_1, \ldots, r_n), f(s_1, \ldots, s_n) \in Ts \wedge \forall i \in 1..n.\ \exists C.\ r_i, s_i \in C$ **do**

        $\lfloor$ *WrongIncrEUF*$(f(r_1, \ldots, r_n) = f(s_1, \ldots, s_n))$;

else

    $DisEq := DisEq \cup (C_1, C_2)$; // $\bowtie = "\neq"$

    if $C_1 = C_2$ **then** $conflictFound := 1$; **return** ;

Equality reasoning

Exercise 9.12
Characterize tuple (n, m, i, j) such that the following formula is unsat.

$$f^n(x) = f^m(x) \wedge f^i(x) \neq f^j(x)$$

Solving function puzzles

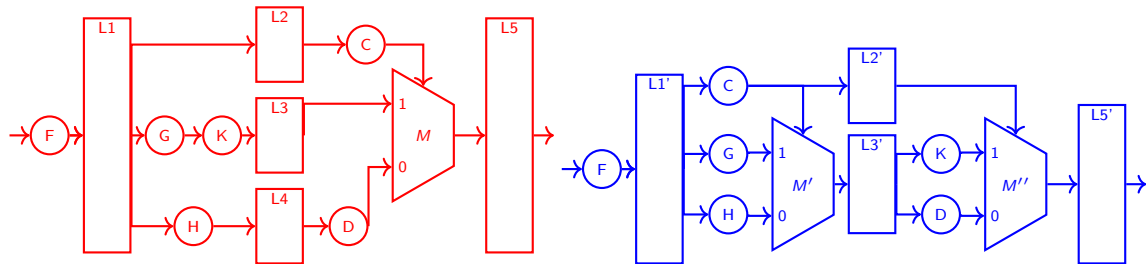## Exercise 9.13
Assume $f : \mathbb{R}^+ \to \mathbb{R}^+$.

$$f(xf(y))f(x) = f(x + y) \wedge f(2) = 0 \wedge (\forall y.\, y < 2 \Rightarrow f(y) > 0) \Rightarrow (\forall y.\, y \geq 2 \Rightarrow f(y) = 0)$$

Exercise: translation validation

Exercise 9.14

Show that the following two circuits are equivalent.

Ls are latches, circles are Boolean circuts, and Ms are multiplexers.

Source: http://www.decision-procedures.org/slides/uf.pdf

End of Lecture 9