

# Automated Reasoning 2018

## Lecture 8: Theory of equality and uninterpreted functions(QF\_EUF)

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## Topic 8.1

### 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.  $\forall x. x \approx x$
2.  $\forall x, y. x \approx y \Rightarrow y \approx x$
3.  $\forall x, y, z. x \approx y \wedge y \approx z \Rightarrow x \approx z$
4. for each  $f/n \in \mathbf{F}$ ,

$$\forall x_1, \dots, x_n, y_1, \dots, y_n. x_1 \approx y_1 \wedge \dots \wedge x_n \approx y_n \Rightarrow f(x_1, \dots, x_n) \approx f(y_1, \dots, y_n)$$

**Note:** Predicates can be easily added if desired

# Proofs in quantifier-free fragment of $\mathcal{T}_{EUF}(\text{QF\_EUF})$

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

$$\frac{x \approx y}{y \approx x} \textit{Symmetry}$$

$$\frac{x \approx y \quad y \approx z}{x \approx z} \textit{Transitivity}$$

$$\frac{x_1 \approx y_1 \quad \dots \quad x_n \approx y_n}{f(x_1, \dots, x_n) \approx f(y_1, \dots, y_n)} \textit{Congruence}$$

## Example 8.1

Consider:  $y \approx x \wedge y \approx z \wedge f(x, u) \not\approx f(z, u)$

$$\frac{\frac{\frac{y \approx x}{x \approx y} \quad y \approx z}{x \approx z}}{f(x, u) \approx f(z, u) \quad f(x, u) \not\approx f(z, u)} \perp$$

# Exercise: equality with uninterpreted functions

## Exercise 8.1

*If unsat, give proof of unsatisfiability*

- ▶  $f(f(c)) \not\approx c \wedge f(c) \approx c$
- ▶  $f(f(c)) \approx c \wedge f(c) \not\approx c$
- ▶  $f(f(c)) \approx c \wedge f(f(f(c))) \not\approx c$
- ▶  $f^3(a) = a \wedge f^5(a) = a \wedge f(a) \neq a$

## Topic 8.2

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 8.2

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

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

## Notation: Boolean encoder

Let  $e$  be a Boolean encoder (defined in the last lecture).

### Example 8.3

Consider  $en = \{t_3 \approx t_4 \mapsto p_1, t_1 \approx t_2 \mapsto p_2\}$

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

# Ackermann's Reduction

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

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## Algorithm 8.1: QF\_EUF\_Sat( $F$ )

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**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**  $f(x_1, \dots, x_n), f(y_1, \dots, y_n) \in Ts$  **do**

┌  $G := G \wedge en(x_1 \approx y_1 \wedge \dots \wedge x_n \approx y_n \Rightarrow f(x_1, \dots, x_n) \approx f(y_1, \dots, y_n))$

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

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

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

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

$G' := e(G)$ ;

**return**  $CDCL(G')$

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## Exercise 8.2

*Can we avoid clauses for the symmetry rule?*



## Other eager encoding

- ▶ Byrant's Encoding

## Topic 8.3

### QF\_EUF solver for SMT

# Lazy theory solver

Axioms are **applied on demand**

CDCL determines the required literals to be analyzed.

Theory solver applies axioms only related to the literals.

## Exercise 8.3

*We have seen the lazy approach in the last lecture.*

*How can we have a mixed lasy/eager approach?*

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**Algorithm 8.2:**  $DP_{EUF}.push(t_1 \bowtie t_2)$ 

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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  $\bowtie = \approx$  then

    if  $C_1 = C_2$  then return ;

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

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

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

else

    //  $\bowtie = \not\approx$

$DisEq := DisEq \cup (C_1, C_2)$ ;

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

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

$DP_{EUF}.push(f(r_1, \dots, r_n) \approx f(s_1, \dots, s_n))$ ;

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# Completeness is not obvious

## Example 8.5

Consider:  $x \approx y \wedge y \approx z \wedge f(x, u) \not\approx f(z, u)$

$$\frac{\frac{x \approx y}{f(x, u) \approx f(y, u)} \quad \frac{y \approx z}{f(y, u) \approx f(z, u)}}{f(x, u) \approx f(z, u)} \quad f(x, u) \not\approx f(z, u)$$

$\perp$

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 proofs exists, does it endanger the completeness of  $DP_{EUF}.push$ ?

# Completeness of $DP_{EUF}.push$

## Theorem 8.1

Let  $\Sigma = \{\ell_1, \dots, \ell_n\}$  be a set of literals in  $\mathcal{T}_{EUF}$ .

$DP_{EUF}.push(\ell_1); \dots; DP_{EUF}.push(\ell_n)$ ; finds conflict iff  $\Sigma$  is unsat.

## Proof.

Since  $DP_{EUF}.push$  uses only sound proof steps of the theory, it cannot find conflict if  $\Sigma$  is sat.

Assume  $\Sigma$  is unsat and there is a proof for it.

Since  $DP_{EUF}.push$  applies congruence **only if the resulting terms appear** in  $\Sigma$ , we show that there is a proof that contains only such terms.

# Completeness of $DP_{EUF}.push$ (contd.)

## Proof(contd.)

Since  $\Sigma$  is unsat, there is  $\Sigma' \cup \{s \not\approx t\} \subseteq \Sigma$  s.t.  $\Sigma' \cup \{s \not\approx t\}$  is unsat and  $\Sigma'$  contains only positive literals.<sub>(why?)</sub>

Consider a proof that derives  $s \approx t$  from  $\Sigma'$ .

Therefore, we must have a proof step such that

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

Flattened transitivity rule!!

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

## Exercise 8.4

Show the last claim holds.

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

## Completeness of $DP_{EUF}.push$ (contd.)

### Proof(contd.)

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

**Observation:** if  $u_i \approx u_{i+1}$  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 8.5

*Justify the “wlog” claim.*

## Completeness of $DP_{EUF}.push$ (contd.)

### Proof(contd.)

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

### base case:

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

### induction step:

We need not worry about  $u_i \approx u_{i+1}$  that are coming from  $\Sigma'$ .

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

### Example 8.6

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

## Completeness of $DP_{EUF}.push(\text{contd.})$

### Proof(contd.)

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

$$\frac{s \approx \dots \frac{\frac{u_{11} \approx u_{21}}{f(u_{11}, \dots, u_{1k}) \approx f(u_{21}, \dots, u_{2k})} \dots \frac{u_{1k} \approx u_{2k}}{f(u_{21}, \dots, u_{2k})} \dots \frac{u_{(j-1)1} \approx u_{j1}}{f(u_{(j-1)1}, \dots, u_{(j-1)k}) \approx f(u_{j1}, \dots, u_{jk})} \dots \frac{u_{(j-1)k} \approx u_{jk}}{f(u_{j1}, \dots, u_{jk})} \dots \approx t}{s \approx t},$$

We know  $f(u_{11}, \dots, u_{1k})$  and  $f(u_{j1}, \dots, u_{jk})$  occur in  $\Sigma'$ .<sub>(why?)</sub>

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

### Exercise 8.6

*Justify the* <sub>(why?)</sub>.

# Completeness of $DP_{EUF}.push$ (contd.)

## Proof(contd.)

We can rewrite the proof in the following form.

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

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

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

## Example 8.7

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

## Topic 8.4

### Algorithms for EUF

## $DP_{EUF}$ implementation - union-find

Equivalence classes are usually implemented using union-find data structure

- ▶ each class is represented using a tree over its member terms
- ▶ root of the tree represents the class
- ▶ `getClass()` returns root of the tree, which involves traversing to the root
- ▶ `mergeClasses()` simply adds the root of **smaller tree** as a child of the root of larger class

Efficient data-structure: for  $n$  pushes, run time is  $O(n \log n)$

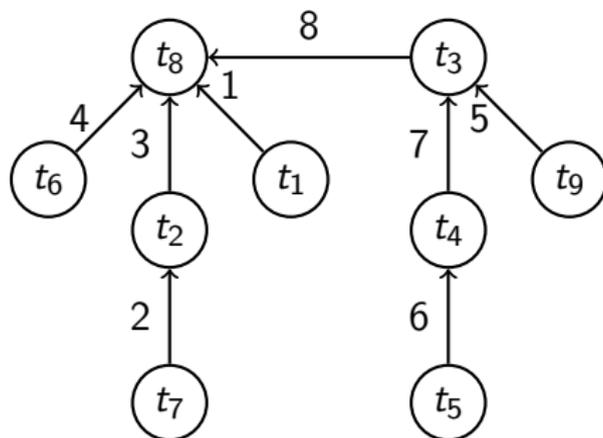
### Exercise 8.7

*Prove the above complexity*

# Example: union-find

Consider:

$$\underbrace{t_1 \approx t_8}_1 \wedge \underbrace{t_7 \approx t_2}_2 \wedge \underbrace{t_7 \approx t_1}_3 \wedge \underbrace{t_6 \approx t_7}_4 \wedge \underbrace{t_9 \approx t_3}_5 \wedge \underbrace{t_5 \approx t_4}_6 \wedge \underbrace{t_4 \approx t_3}_7 \wedge \underbrace{t_7 \approx t_5}_8 \wedge \underbrace{t_1 \not\approx t_4}_9$$



## unsatCore using union find

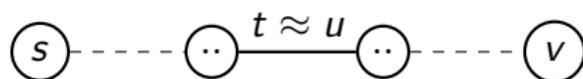
- ▶ generate proof of unsatisfiability using union find
- ▶ collect leaves of the proof, which can serve as an unsat core

## Proof generation in union-find

Proof generation from union find data structure for an unsat input.

The proof is constructed **bottom up**.

1. There must be a dis-equality  $s \neq v$  that was violated.  
We need to find the proof for  $s \approx v$ .
2. Find the latest edge in the path between  $s$  and  $v$ . Let us say it is due to input literal  $t \approx u$ .



Recursively, find the proof of  $s \approx t$  and  $u \approx v$ .

We stitch the proofs as follows

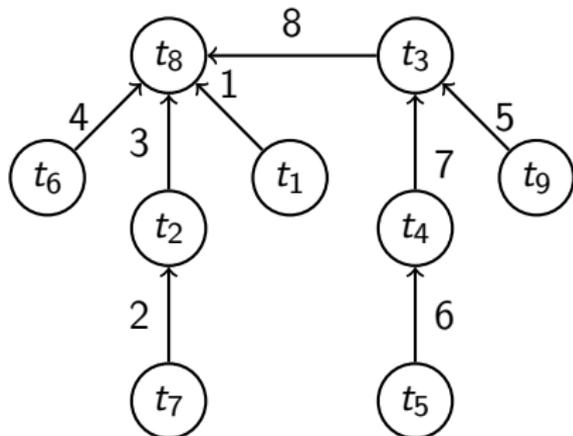
$$\frac{\frac{\dots}{s \approx t} \quad t \approx u \quad \frac{\dots}{u \approx v}}{s \approx v}$$

For improved algorithm: R. Nieuwenhuis and A. Oliveras. Proof-producing congruence closure. RTA'05, LNCS 3467

# Example: union-find proof generation

Consider:

$$\underbrace{t_1 \approx t_8}_1 \wedge \underbrace{t_7 \approx t_2}_2 \wedge \underbrace{t_7 \approx t_1}_3 \wedge \underbrace{t_6 \approx t_7}_4 \wedge \underbrace{t_9 \approx t_3}_5 \wedge \underbrace{t_5 \approx t_4}_6 \wedge \underbrace{t_4 \approx t_3}_7 \wedge \underbrace{t_7 \approx t_5}_8 \wedge \underbrace{t_1 \not\approx t_4}_9$$



1.  $t_1 \not\approx t_4$  is violated.
2. 8 is the latest edge in the path between  $t_1$  and  $t_4$
3. 8 is due to  $t_7 \approx t_5$
4. Look for proof of  $t_1 \approx t_7$  and  $t_5 \approx t_4$
5. 3 is the latest edge between  $t_1$  and  $t_7$ , which is due to  $t_7 \approx t_1$ .
6. Similarly,  $t_5 \approx t_4$  is edge 6

$$\frac{t_7 \approx t_1}{t_1 \approx t_7}$$

$$\frac{t_1 \approx t_7 \quad t_7 \approx t_5 \quad t_5 \approx t_4}{t_1 \approx t_4}$$

$$t_1 \not\approx t_4$$

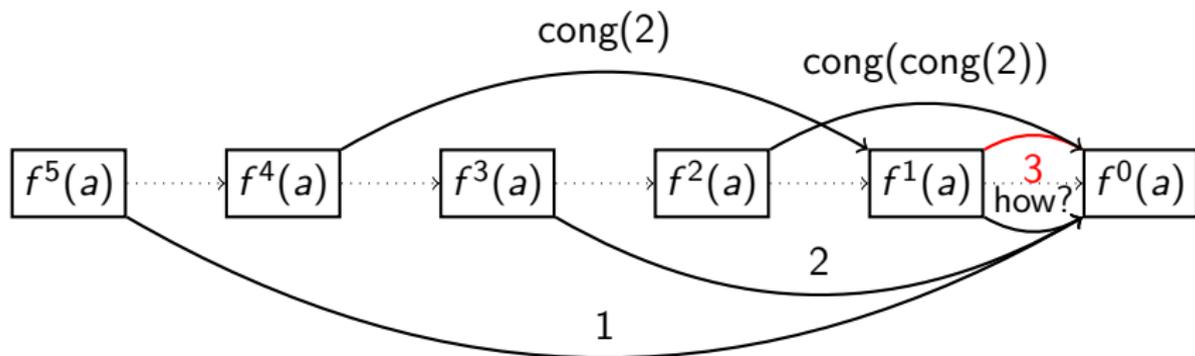
⊥

# Example: extending to congruence

## Example 8.8

Run union find on  $f^5(a) \approx a \wedge f^3(a) \approx a \wedge f(a) \not\approx a$

.....> Term parent relation



Extract proof from the above graph?

## Union-find in the context of SMT solver

SMT solver design causes **frequent calls** to `getClass()`, which is not constant time.

To make it constant time, we may **add another field** in each node that points to the root.

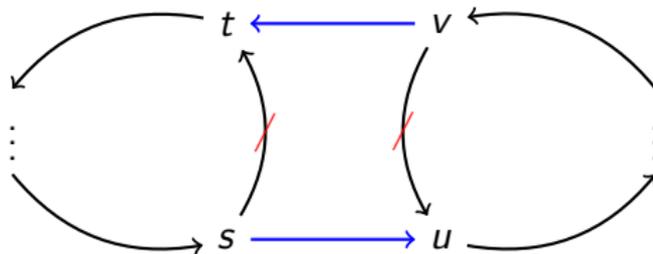
- ▶ **Increases** the cost of merge: needs to update the root field in each node
- ▶ Traversal in the tree needs **a stack**

Why not use a **simpler data structure**?

## Union-find using circular linked lists

We may represent the equivalence class using **circular linked lists** and each node has a field to indicate the root, therefore `getClass()` is constant time

- ▶ merging two circular linked lists via field *next*



$s.next, v.next := v.next, s.next$

### Exercise 8.8

*How to split circular linked lists at two given nodes?*

## Merge/unmerge classes

- ▶ On class merge,
  - ▶ the two circular linked lists are merged and
  - ▶ the root fields in the smaller of the two are set to the root of the other.
  - ▶ the “looser” root of the smaller list is recorded in order for possible unmerge
  
- ▶ On backtracking, we iterate over the losers record in the reverse order and unmerge
  1. Let node  $x$  be the current top loser root.
  2.  $r := \text{getClass}(x)$ ;  $r.\text{next}, x.\text{next} := x.\text{next}, r.\text{next}$ .
  3. make  $x$  root of the part that contains  $x$ .

## Example: merge/demerge classes

# Data structures for congruence

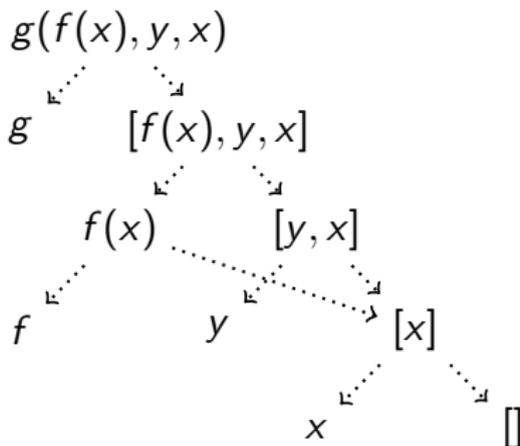
Terms as binary DAGs

- ▶ Term has two children: the top symbol and argument list
- ▶ Argument list has two children: the first term and tail list

We compute **equivalence of terms as well as term lists**.

The left child is called “car” and the right child is called “cdr”.

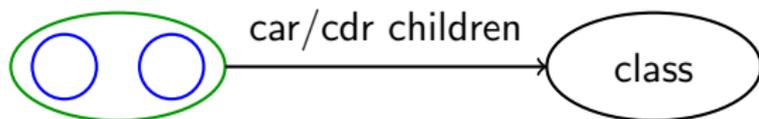
## Example 8.9



# Data structures for congruence

We add **three fields** in nodes to maintain equivalence class of nodes whose

1. **car children are equivalent** car parent classes
2. **cdr children are equivalent** cdr parent classes
3. **both children are equivalent** congruent classes



Green: car/cdr children are in same class

Blue: both children in the same class

## Exercise 8.9

*Prove: each class consists of nodes that are either car children or cdr children.*

**Commentary:** Car/Cdr sets are again maintained as circular linked lists. Similarly (un)merged but trigger by (un)merger of their car/cdr children. The looser root needs to keep sufficient information for unmerge. 3rd class is stored as the earlier union-find data structure.

## Data Structures for congruence II

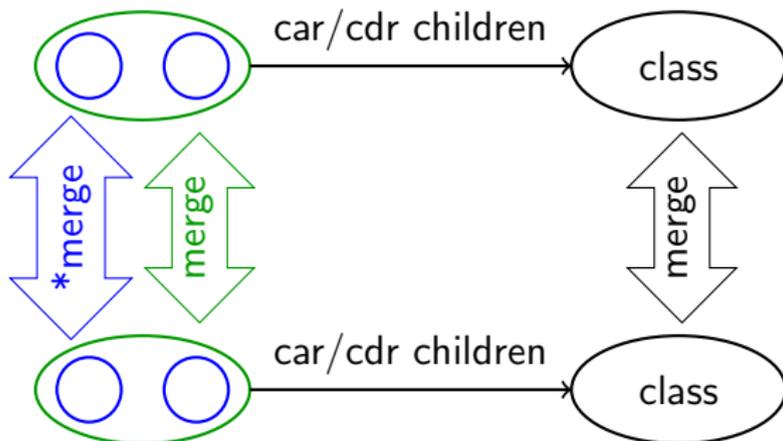
We also maintain a hash map containing  $(x.car.root, x.cdr.root) \mapsto x$  entries for the roots of the congruent classes

The hash map allows to quickly identify which two congruent classes are ready to be merged.

## Applying congruence upon merger

Consider two classes are being merged.

- ▶ In the smaller **car/cdr parent class**, iterate over the roots of the **congruent classes**
  - ▶ Check if they can be merged with the congruent classes in the other parent class using the hash map.
  - ▶ If two congruent classes merge, it triggers a new merge of classes



\*conditional merge of **congruent classes**

## Data structure for disequalities

For each equivalence class, we maintain a set of the other unmergable classes

- ▶ the set cannot be maintained as a circular linked lists over nodes by adding new field
- ▶ The set is maintained “exogenously”, i.e., extra nodes allocated

### Exercise 8.10

*If we have input that says some  $n > 2$  terms are distinct,*

*(distinct  $t_1 \dots t_n$ )*

*How many entries we need in the unmergable classes lists?*

*Can we do it better?*

# Example: congruence data structure

## Example 8.10

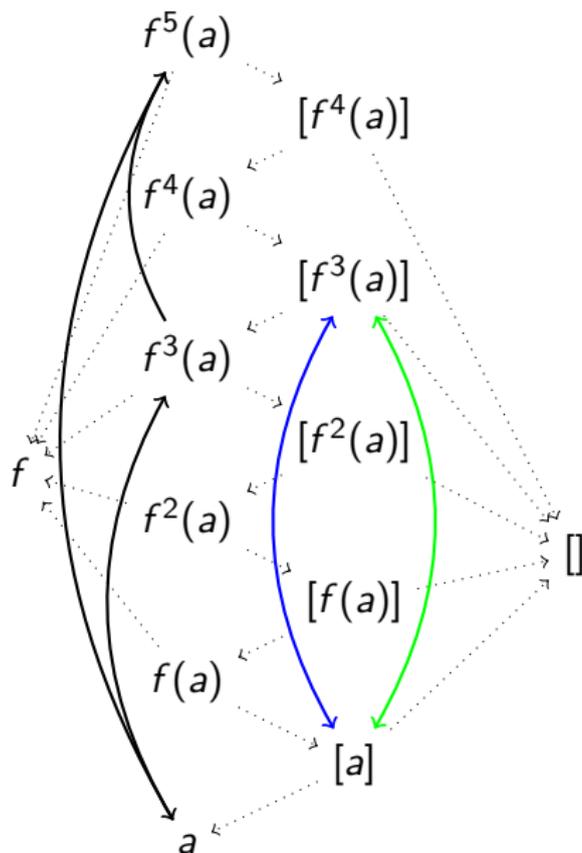
Consider

$$\underbrace{f^5(a) \approx a}_1 \wedge$$

$$\underbrace{f^3(a) \approx a}_2 \wedge$$

$$\underbrace{f(a) \not\approx a}_3$$

$$\text{class} = \{f^5(a), f^3(a), a\}$$



# Topic 8.5

## Problems

# Problem

## Exercise 8.11 (1.5 points)

*Prove/Disprove that the following formula is unsat.*

$$(f^4(a) \approx a \vee f^6(a) \approx a) \wedge f^3(a) \approx a \wedge f(a) \not\approx a$$

*If unsat give a proof otherwise give a satisfying assignment.*

*Please show a run of DPLL( $\mathcal{T}$ ) and union-find on the above example.*

End of Lecture 8