## The Extended Theory of Trees and Algebraic (Co)datatypes

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#### SMT@CAV 2021

## Algebraic datatypes (inductive datatypes)

data	nat	= zero	succ(pred:	nat)		
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Selectors: pred, head, tail

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Constructors: zero, succ, nil, cons

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head(cons(x, y)) = x

## SMT-LIB standard

#### SMT-LIB syntax:

```
(declare-datatypes
 ((nat 0)(list 0)) (
  ((zero) (succ (pred nat) ))
  ((nil) (cons (head nat) (tail list)))
 ))
```

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~ quantified formulae become undecidable!

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let t = cons(zero, t)

→ allow infinite inhabitants: t = cons(zero, cons(zero, ...))

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- dual of inductive datatypes
- Iazily evaluated infinite objects (e.g. in Haskell)
- useful in theorem provers (e.g. Coq, Lean)

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Supported for SMT?

- X in SMT-LIB standard
- CVC4 (but not many more solvers)

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- ✓ datatypes part of SMT-LIB
- good support for datatypes
- Iacking support for codatatypes
- X static finite/infinite separation
- first-order theory is undecidable

## A different perspective: Trees



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x = cons(zero, cons(succ(zero), x))

## First-order Theory of Trees

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 Decision procedures: MAHER 1988 and COMON & LESCANNE 1989 (independently)

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applications:

- matching and unification
- semantics of logic & functional programs
- recursion schemes
- verification of programs
- term rewriting systems
- in this talk: algebraic (co)datatypes

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#### add a finiteness predicate: fin(x)

- ~> can reason about finite & infinite trees within the same theory
  - they gave a decision procedure
- outputs a simplified formula
- easy to read off all models

## Good properties

The (Extended) First-Order Theory of Trees ...

- ✓ has seen many applications
- ✓ is decidable
- even admits a simplification procedure
- can be used to solve formulae in the theory of (co)datatypes\*
- ✓ is more expressive than (co)datatypes

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The (Extended) First-Order Theory of Trees ...

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- ✓ is more expressive than (co)datatypes

#### $\implies$ interesting theory for the SMT community

explain relationship between (co)datatypes and trees

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- simplification procedure/constraint solver
  - allowing quantifiers
  - based on DJELLOUL, DAO, FRÜHWIRTH (2008) ...
  - ... but allowing finitely many constructors
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- $\implies$  Extended Theory of Trees is useful and decidable

# Part II: Relationship between (Co)datatypes and Trees

Concept	Trees (Co)datatyp		
x is finite	fin(x)	x is datatype	
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- $\implies$  Trees more expressive than (co)datatypes
- ... but datatypes have selectors? We can get rid of them ...

## Translating (quantifier-free) (co)datatypes to trees

Input: tail(v) = cons(zero, tail(w))

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Output:  $\exists x, y. \quad x = cons(zero, \quad y \quad)$   
 $\land \qquad x = tail(v)$   
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- 2. add equations for congruence

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Input: tail(v) = cons(zero, tail(w))Output:  $\exists x, y. \quad x = cons(zero, y)$   $\land (\forall a, b. v = cons(a, b) \rightarrow x = b)$   $\land (\forall c, d. w = cons(c, d) \rightarrow y = d)$  $\land (v = w \rightarrow x = y)$ 

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(

Input: tail(v) = cons(zero, tail(w))

**Output:** 
$$\exists x, y. \quad x = \operatorname{cons}(\operatorname{zero}, \quad y \quad)$$
  
  $\land (\forall a, b, v = \operatorname{cons}(a, b) \to x = b)$   
  $\land (\forall c, d, w = \operatorname{cons}(c, d) \to y = d)$   
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Theorem (for quantifier-free formulae)

The result is equisatisfiable in the Extended Theory of Trees.

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#### Theorem (for selectors with default values)

We can translate any quantified formula in (Co)datatypes to an equisatisfiable one in Trees.

### Trees vs (co)datatypes: relationship



# Part III: Decision procedures

• works on normal forms  $\phi$ :

$$\phi \equiv \exists \bar{x}_{\cdot} \alpha \land \bigwedge_{i=1}^{n} \neg \phi_{i}$$
"simple conjunction" nested normal form

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- 16 rewrite rules
- simplified formula: nested only once + more conditions
- ► Example:  $x = \operatorname{succ}(y) \land \operatorname{fin}(y) \land \neg(\exists w. y = \operatorname{succ}(w) \land \operatorname{fin}(z))$

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- ► Example:  $x = \operatorname{succ}(y) \land \operatorname{fin}(y) \land \neg(\exists w. y = \operatorname{succ}(w) \land \operatorname{fin}(z))$
- Restriction: infinitely many constructors required
- → useless for (co)datatypes
- Our contribution: lift this restriction

case analysis on constructors:

 $\blacktriangleright \quad \forall x : nat. \, x = \mathsf{zero} \lor \exists y : nat. \, x = \mathsf{succ}(y) \rightsquigarrow \checkmark$ 

$$\forall y : nat. \, x \neq \mathsf{succ}(y) \rightsquigarrow x = \mathsf{zero}$$

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sorts with only (in)finite inhabitants

bool = false | trueinftree = c1(inftree) | c2(inftree)

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#### unique infinite inhabitants

$$\blacktriangleright \neg \operatorname{fin}(x: nat) \rightsquigarrow x = \operatorname{succ}(x)$$

### Deciding the Extended Theory of Trees

Our extended algorithm for the general setting

Idea: case splits

Deciding the Extended Theory of Trees Our extended algorithm for the general setting Idea: case splits

for sorts with finitely many constructors:

• if x : nat then  $x = \text{zero} \lor \exists y.x = \text{succ}(y)$ 

► Example: input  $\exists x : nat. \alpha \land \cdots$  is transformed into  $(\exists x. x = \text{zero} \land \alpha \land \cdots) \lor (\exists x, y. x = \text{succ}(y) \land \alpha \land \cdots)$  Deciding the Extended Theory of Trees Our extended algorithm for the general setting Idea: case splits

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- for sorts with finitely many (in)finite inhabitants:
  - if x : nat then  $fin(x) \lor x = succ(x)$
- but be clever about when to case split
  - avoid unnecessary work
  - avoid infinite loops

### Results

#### Theorem

- Our simplification procedure returns a simplified formula that is equivalent in the Extended Theory of Trees.
- Simplified formula allows reading off all satisfying assignments of free variables.
- ► If input formula is closed, the result is true or false.

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### Examples

$$x = \operatorname{succ}(x) \lor \operatorname{fin}(x) \quad \rightsquigarrow \quad \operatorname{true}$$

 $\blacktriangleright \ x \neq \mathsf{nil} \land \mathsf{fin}(x) \quad \rightsquigarrow \quad \exists y, z. \, x = \mathsf{cons}(y, z) \land \mathsf{fin}(y) \land \mathsf{fin}(z)$ 

### Implementation

- prototype implementation in Scala
- translates (co)datatypes  $\rightarrow$  trees
  - standard semantics (SMT-LIB) or
  - selector semantics with default values
- implements the simplification procedure

Try it online!  $\rightarrow$  tinyurl.com/trees-codata

### **Evaluation**

In theory:

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# **Evaluation**

### In theory:

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### In practice:

- evaluated on 4000 tests of QF\_DT suite of the SMT-LIB
- translate from datatypes to trees, then solve
- 90% took < 1 second</p>
- 5% timed out after 10 seconds
- lots of "low-hanging fruit" for improvements

## Conclusion

The Extended Theory of Trees is ...

- useful: for (co)datatypes, logic programming, term rewriting, verification, ...
- powerful: more expressive than (co)datatypes
- decidable: even admits a simplification procedure

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For details ...

- Fabian Zaiser, Luke Ong. The Extended Theory of Trees and Algebraic (Co)datatypes. HCVS@ETAPS2020
- Implementation: tinyurl.com/trees-codata

# Backup slides

### The basic idea Manipulate normal forms $\phi$ (DJELLOUL, ET AL 2008):

$$\phi \equiv \exists \bar{x}_{\cdot} \alpha \land \bigwedge_{i=1}^{n} \neg \phi_{i} \longleftarrow$$

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Perform case analysis:

- for sorts with finitely many constructors:
  - if x : nat then  $x = \text{zero} \lor \exists y.x = \text{succ}(y)$

$$\exists x : nat. \alpha \land \dots \\ \rightsquigarrow (\exists x. x = \mathsf{zero} \land \alpha \land \dots) \lor (\exists x, y. x = \mathsf{succ}(y) \land \alpha \land \dots)$$

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but avoid infinite loops:

 $x = \operatorname{succ}(x) \quad \rightsquigarrow \quad \exists y.x = \operatorname{succ}(y) \land y = \operatorname{succ}(y) \quad \rightsquigarrow$