



# SAT/SMT Solving and Applications in Rewriting

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# Outline

1. Solution of Exercise of Session 2
2. Lazy SMT Approach: Overview
3. Application: Polynomial Interpretations
4. Non-Linear (Bit-Vector) Arithmetic
5. Certification
6. Further Reading

## Exercise

Develop a LIA encoding that searches for an argument filter  $\pi$  in combination with KBO parameters

$$\lceil \pi(s) \succ \pi(t) \rceil$$

definitions

- $\pi(x) = x$
- $\pi(f(t_1, \dots, t_n)) = \begin{cases} \pi(t_i), & \text{if } \pi(f) = i \\ f([\pi(t_i) \mid i \leftarrow [1..n], i \in \pi(f)]), & \text{if } \pi(f) \text{ is a set} \end{cases}$
- $w(x) = w_0$
- $w(f(t_1, \dots, t_n)) = w(f) + w(t_1) + \dots + w(t_n)$
- $s \succ t$  if  $\mathcal{V}(s) \supseteq \mathcal{V}(t) \wedge (w(s) > w(t) \vee w(s) \geq w(t) \wedge \dots \text{ some cases } \dots)$

## Solution of Encoding KBO + AF (1/2)

- we use propositional variables  $set(f), i \in \pi(f)$  to represent AFs as for LPO
- we use the same constraints to enforce that the AF is well-formed
- **if-then-else** is written as  $\lceil if(b, t, e) \rceil$ ; it is a short-cut for
  - creating a fresh integer variable  $i$
  - returning  $i$  as the result of  $\lceil if(b, t, e) \rceil$
  - adding  $b \rightarrow i = t$  and  $\neg b \rightarrow i = e$  to global constraints
- encode frequency of variable  $x$  in term  $t$  as integer variable  $\lceil \#_x(\pi(t)) \rceil$ ; add constr.
  - $\lceil \#_x(\pi(x)) \rceil = 1$  and  $\lceil \#_x(\pi(y)) \rceil = 0$  if  $x \neq y$
  - $\lceil \#_x(\pi(f(t_1, \dots, t_n))) \rceil = \lceil if(1 \in \pi(f), \lceil \#_x(\pi(t_1)) \rceil, 0) \rceil + \dots + \lceil if(n \in \pi(f), \lceil \#_x(\pi(t_n)) \rceil, 0) \rceil$
- now  $\mathcal{V}(\pi(s)) \supseteq \mathcal{V}(\pi(t))$  is encoded as  $\bigwedge_{x \in \mathcal{V}(t)} \lceil \#_x(\pi(s)) \rceil \geq \lceil \#_x(\pi(t)) \rceil$
- the weight computation is similar using integer variables  $\lceil w(\pi(t)) \rceil$ 
  - $\lceil w(\pi(x)) \rceil = w_0$
  - $\neg set(f) \rightarrow i \in \pi(f) \rightarrow \lceil w(\pi(f(t_1, \dots, t_n))) \rceil = \lceil w(\pi(t_i)) \rceil$
  - $set(f) \rightarrow \lceil w(\pi(f(t_1, \dots, t_n))) \rceil = w(f) + \lceil if(1 \in \pi(f), \lceil w(\pi(t_1)) \rceil, 0) \rceil + \dots + \lceil if(n \in \pi(f), \lceil w(\pi(t_n)) \rceil, 0) \rceil$

## Solution of Encoding KBO + AF (2/2)

- having integer variables  $\lceil w(\pi(t)) \rceil$  and an encoding of  $\mathcal{V}(\pi(s)) \supseteq \mathcal{V}(\pi(t))$ , encoding term comparisons in KBO + AF is now similar to the term comparison of LPO + AF
- additional challenge: admissibility
  - we need to encode  $\lceil unary(f) \rceil := set(f) \wedge \lceil exactlyOne(1 \in \pi(f), \dots, n \in \pi(f)) \rceil$
  - being largest in precedence can be restricted to those symbols  $g$  that remain

$$\lceil unary(f) \rceil \rightarrow w(f) = 0 \rightarrow \bigwedge_{g \neq f} (set(g) \rightarrow p(f) > p(g))$$

- weights for constants need to be adjusted:  $set(f) \rightarrow (\bigwedge_i \neg(i \in \pi(f))) \rightarrow w(f) \geq w_0$
- no weight restrictions for  $w(f)$  apply, whenever  $\neg set(f)$

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## SMT Solving at a Glance

- DPLL(T) is common approach for SMT solving
- requirement: **theory solver** for  $T$ 
  - given **conjunction of literals**, decide  $T$ -satisfiability
- overview of theory solvers
  - **LRA: simplex algorithm** (Dutertre and de Moura)
    - incremental interface
    - delivers minimal unsatisfiable cores
  - **LIA: LRA + branch-and-bound algorithm**
    - call simplex on constraints  $\varphi$
    - if  $\varphi$  is unsat in  $\mathbb{Q}$  then return “unsat”
    - if solution delivers  $\alpha(x) = q \notin \mathbb{Z}$ , then branch on  $\varphi \wedge x \leq \lfloor q \rfloor$  “or”  $\varphi \wedge x \geq \lceil q \rceil$
    - otherwise, return integer solution
  - many extensions for LIA
  - **EUF: congruence closure algorithm**
  - **combination of theories: Nelson–Oppen**, deterministic or nondeterministic version
- due to limited time: omit further details in this course

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## Definition (Linear Polynomial Interpretation)

- fix some signature  $\mathcal{F}$ ; choose for each  $n$ -ary  $f \in \mathcal{F}$  a linear polynomial  $p(f)$ :

$$p(f) = f_0 + f_1x_1 + \dots + f_nx_n$$

such that  $f_0 \in \mathbb{N}$  and  $f_i \in \mathbb{N} \setminus \{0\}$  for  $1 \leq i \leq n$

- interpretation of terms
  - $\llbracket x \rrbracket = x$
  - $\llbracket f(t_1, \dots, t_n) \rrbracket = p(f)\{x_1/\llbracket t_1 \rrbracket, \dots, x_n/\llbracket t_n \rrbracket\}$
- definition of order:  $s \succ t$  iff  $\forall \vec{x}. \llbracket s \rrbracket > \llbracket t \rrbracket$  where variables  $\vec{x}$  range over  $\mathbb{N}$

## Example (Termination of $\{plus(s(x), y) \rightarrow s(plus(x, y)); plus(0, y) \rightarrow y\}$ )

- choose  $p(0) = 5$  and  $p(\text{plus}) = 2 \cdot x_1 + x_2$  and  $p(s) = 1 + x_1$
- first rule:  $2 \cdot (1 + x) + y > 1 + 2 \cdot x + y$
- second rule:  $2 \cdot 5 + y > y$

## Definition (Encoding for Linear Polynomial Interpretations)

- fix some signature  $\mathcal{F}$ ; encode for each  $n$ -ary  $f \in \mathcal{F}$  a linear polynomial  $p(f)$  using (SMT) integer **variables**  $f_i$ :

$$p(f) = f_0 + f_1x_1 + \dots + f_nx_n$$

and **add constraints**  $f_0 \geq 0$  and  $f_i \geq 1$  for  $1 \leq i \leq n$

- compute  $\llbracket t \rrbracket$  symbolically and then compare coefficients for each variable:

$$a + bx + cy + \dots > a' + b'x + c'y + \dots \equiv \underbrace{a > a' \wedge b \geq b' \wedge c \geq c' \wedge \dots}_{\text{SMT constraint}}$$

## Example (Constraint of first rule $plus(s(x), y) \rightarrow s(plus(x, y))$ )

$$\begin{aligned} & plus_0 + plus_1(s_0 + s_1x) + plus_2y > s_0 + s_1(plus_0 + plus_1x + plus_2y) \\ \equiv & (plus_0 + plus_1s_0) + plus_1s_1x + plus_2y > (s_0 + s_1plus_0) + s_1plus_1x + s_1plus_2y \\ \equiv & plus_0 + plus_1s_0 > s_0 + s_1plus_0 \wedge plus_1s_1 \geq s_1plus_1 \wedge plus_2 \geq s_1plus_2 \quad \text{SMT constr.} \end{aligned}$$

## Exercise

- design an optimized encoder for polynomial constraints; you should consider a weakly monotone setting where the condition

$$f_0 \geq 0 \text{ and } f_i \geq 1 \text{ for all } 1 \leq i \leq n$$

is weakened to

$$f_i \geq 0 \text{ for } 0 \leq i \leq n$$

- test your encoding on the following term constraints

$$\text{minus}(s(x), s(y)) \preceq \text{minus}(x, y)$$

$$\text{minus}(x, 0) \preceq x$$

$$\text{div}(s(x), s(y)) \succ \text{div}(\text{minus}(x, y), s(y))$$

where  $s \preceq t$  is defined as  $\forall \vec{x}. \llbracket s \rrbracket \geq \llbracket t \rrbracket$

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## A Problem

- resulting constraints are **non-linear integer** constraints
- problem: NIA is undecidable
- encoding does not matter: linear polynomial termination is undecidable

## A Solution

- restrict search space: often small coefficients suffice, e.g.,  $f_i \in \{0, \dots, 3\}$ , i.e., each  $f_i$  is a 2-bit number
- on numbers with fixed bit-width, one can perform **bit-vector arithmetic**
- basic idea: encode hardware adders, **multipliers**, comparisons, etc. into **SAT**
- SMT theory **QF\_BV**: bitvector arithmetic uses **eager approach** for SMT solving
- result: obtain incomplete NIA solver via decidable BV theory

## Handling Overflows

- BV differs from NIA in that overflows may happen
- $3 > 3 + 3$  if everything is evaluated using 2-bit unsigned numbers
- **overflows must not happen** in order to simulate NIA computations in BV
- two solutions: **choose enough bits** or **forbid overflows**

## Handling Overflows: Choose Enough Bits

- consider linear polynomial interpretation example
- non-linear formula is known

$$\text{plus}_0 + \text{plus}_1 s_0 > s_0 + s_1 \text{plus}_0 \wedge \text{plus}_2 \geq s_1 \text{plus}_2$$

- given  $b$  bits as input size for variables, we can bound bit-sizes of intermediate expressions

$$\underbrace{\underbrace{\underbrace{\text{plus}_0}_{b} + \underbrace{\underbrace{\text{plus}_1}_{b} \underbrace{s_0}_{b}}_{2b}}_{2b+1}}_{2b+1} > \underbrace{\underbrace{\underbrace{s_0}_{b} + \underbrace{\underbrace{s_1}_{b} \underbrace{\text{plus}_0}_{b}}_{2b}}_{2b+1}}_{2b+1} \wedge \underbrace{\underbrace{\text{plus}_2}_{b}}_{2b} \geq \underbrace{\underbrace{\underbrace{s_1}_{b} \underbrace{\text{plus}_2}_{b}}_{2b}}_{2b}$$

- hence, one just has to perform each bit-vector operation with enough bits

## Handling Overflows: Choose Enough Bits, Optimized

- computing upper bounds on values results in better bit-bounds

$$\underbrace{\underbrace{\text{plus}_0}_{2^b-1} + \underbrace{\underbrace{\text{plus}_1}_{2^b-1} \underbrace{s_0}_{2^b-1}}_{(2^b-1)^2}}_{(2^b-1)^2+2^b-1} > \underbrace{s_0}_{2^b-1} + \underbrace{\underbrace{s_1}_{2^b-1} \underbrace{\text{plus}_0}_{2^b-1}}_{(2^b-1)^2} \wedge \underbrace{\text{plus}_2}_{2^b-1} \geq \underbrace{\underbrace{s_1}_{2^b-1} \underbrace{\text{plus}_2}_{2^b-1}}_{(2^b-1)^2}$$

- previous slide:  $2b + 1$  bits (7 bits, if  $b = 3$ )
- this slide:  $\lceil \log_2((2^b - 1)^2 + 2^b - 1) \rceil$  bits (6 bits, if  $b = 3$ )



## Handling Overflows: Forbid Overflows

- using always enough bits might be expensive
- alternative
  - select a fixed number of  $b$  bits for inputs
  - select a fixed number of  $c$  bits for calculations,  $b \leq c$
  - all intermediate expressions in formula must be representable with  $c$  bits
  - add constraints that ensure that no overflow happens
  - examples
    - perform addition with  $c + 1$  bits and demand that highest bit of result is 0
    - perform multiplication with  $2c$  bits and demand that the  $c$  highest bits of result are all 0
    - encode multiplication using  $c$  bits with dedicated overflow bit
    - perform multiplication  $x \cdot y$  with  $c$  bits and demand  
“position of first 1-bit in  $x +$  position of first 1-bit of  $y \leq c$ ”
  - coarse constraint for  $c = 3$

$$x_3x_2x_1x_0 \cdot y_3y_2y_1y_0 = z_3z_2z_1z_0 \wedge$$
$$(\neg x_3 \wedge \neg x_2 \wedge \neg x_1 \vee \neg x_3 \wedge \neg x_2 \wedge \neg y_3 \wedge \neg y_2 \vee \neg y_3 \wedge \neg y_2 \wedge \neg y_1)$$

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## Current State

- SAT and SMT encodings are useful for **proof** search
  - often easy to design encoding
  - benefit from powerful SAT and SMT solvers
  - here: focus on termination proving for TRSs
- problem: **reliability**
  - SAT and SMT solver might be buggy
  - language binding might be buggy
  - encoding might contain some mistake
  - implementation of encoding might be buggy
- solution: **certification**
  - validate generated proofs

## Certification – The Easy Direction

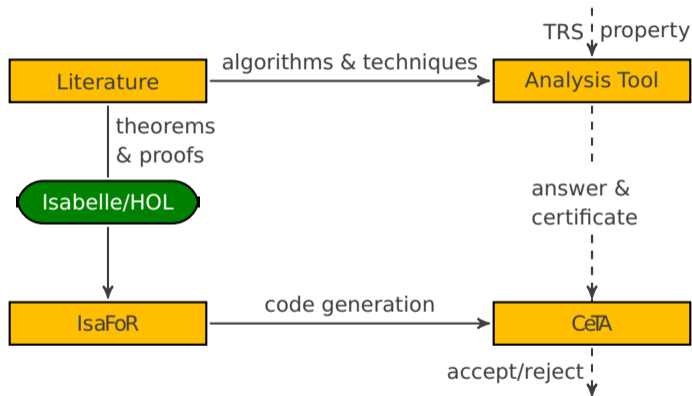
- all examples so far aimed at finding satisfying assignments
  - find parameters of KBO, LPO and polynomial interpretations
  - find argument filters
- every satisfying assignment leads to **concrete instance** of that term order, e.g.:
  - KBO with  $w_0 = 5$ ,  $w(\text{plus}) = 2$ ,  $p(\text{plus}) > p(\text{s})$ , ...
  - AF with  $\pi(\text{minus}) = 1$ ,  $\pi(\text{div}) = \{1\}$ , ...
- given a concrete term order  $\succ$ , it is often trivial to check correct application
  - check  $\ell \succ r$  for all  $\ell \rightarrow r \in \mathcal{R}$
  - check admissibility of KBO parameters, ...
- the corresponding algorithms
  - do not require any encodings or any invocation of a SAT or SMT solver
  - are often simple to implement and are therefore less likely to be bugged
- AProVE (in 2007) contained two independent implementations for several orders
  - ① an optimized search engine
  - ② a simple implementation for concrete instances; used for internal validation

## Certification – Trust the Validation Algorithm

- remaining problem
  - what if certification algorithm is buggy?
  - what if definition of order itself is buggy?
- solution: **formal verification**
  - formal verification: formal proof using **proof assistant** such as Isabelle, Coq, Lean, ...
  - verify correctness of certification algorithm
  - verify properties of order, e.g., “LPO is reduction order”
- both in termination competition and confluence competition, validity of several proofs is checked by formally verified certifier: **CeTA**
  - several: not all proofs are supported CeTA
  - CeTA: Certified Tool Assertions, developed in Innsbruck
- example: all CR/COM/INF-tags in ARI-database are validated by CeTA

<https://ari-cops.uibk.ac.at/ARI/?m=results>

# Formally Verified Certification



<http://cl-informatik.uibk.ac.at/software/ceta/>

## Certification with CēTA

- about CēTA
  - CēTA is just a Haskell program
  - no external libraries required
  - easy to use
    - `ghc --make Main.hs -o ceta`
    - `ceta cpf_proof.xml`
- CPF: Certification Problem Format
  - XML
  - domain-specific proof format, no Isabelle knowledge required
  - covers term rewriting and integer transition systems

- CPF generation is usually straight-forward; in miniTT: 83 lines, cf. Proof.hs
- result of miniTT `cpf kbo plus.ari > kbo_plus.xml`

```
<?xml version="1.0"?>
<?xml-stylesheet type="text/xsl" href="xml/cpf3HTML.xsl"?>
<certificationProblem xmlns:xsi="http://www.w3.org/2001/XMLSchema-instance"
  xsi:noNamespaceSchemaLocation="xml/cpf3.xsd"><cpfVersion>3.0</cpfVersion><lookupTables/>
<input><trsInput><trs><rules><rule><funapp><name>plus</name><funapp><name>s</name><var>n
</var></funapp><var>m</var></funapp><funapp><name>s</name><funapp><name>plus</name><var>n
</var><var>m</var></funapp></funapp></rule><rule><funapp><name>plus</name><funapp><name>0
</name></funapp><var>m</var></funapp><var>m</var></rule></rules></trs></trsInput></input>
<property><termination/></property><answer><yes/></answer><proof><trsTerminationProof>
<ruleRemoval><knuthBendixOrder><w0>1</w0><precedenceWeight><precedenceWeightEntry><name>0
</name><arity>0</arity><precedence>0</precedence><weight>1</weight></precedenceWeightEntry>
<precedenceWeightEntry><name>plus</name><arity>2</arity><precedence>1</precedence><weight
>0</weight></precedenceWeightEntry><precedenceWeightEntry><name>s</name><arity>1</arity>
<precedence>0</precedence><weight>1</weight></precedenceWeightEntry></precedenceWeight>
</knuthBendixOrder><trs><rules><rule><funapp><name>plus</name><funapp><name>s</name><var>n
</var></funapp><var>m</var></funapp><funapp><name>s</name><funapp><name>plus</name><var>n
</var><var>m</var></funapp></funapp></rule><rule><funapp><name>plus</name><funapp><name>0
</name></funapp><var>m</var></funapp><var>m</var></rule></rules></trs><trsTerminationProof
><rIsEmpty/></trsTerminationProof></ruleRemoval></trsTerminationProof></proof>
</certificationProblem>
```



## Adding Indentation

```
<certificationProblem>
... <input><trs> ... <property><termination> ... <answer><yes> ...
  <knuthBendixOrder>
    <w0>1</w0>
    <precedenceWeight>
      <precedenceWeightEntry>
        <name>0</name>
        <arity>0</arity>
        <precedence>0</precedence>
        <weight>1</weight>
      </precedenceWeightEntry>
      <precedenceWeightEntry>
        <name>plus</name>
        <arity>2</arity>
        <precedence>1</precedence>
        <weight>0</weight>
      </precedenceWeightEntry>
      ...
    </precedenceWeight>
  </knuthBendixOrder>
  ...
</certificationProblem>
```

- conversion to HTML: `xsltproc cpf3HTML.xsl kbo_plus.xml > kbo_plus.html`

The rewrite relation of the following TRS is considered.

$$\text{plus}(s(n),m) \rightarrow s(\text{plus}(n,m))$$

$$\text{plus}(O,m) \rightarrow m$$

## Property / Task

Prove or disprove termination.

## Answer / Result

Yes.

## Proof (by miniTT)

### 1 Rule Removal

Using the Knuth Bendix order with  $w_0 = 1$  and the following precedence and weight functions

$$\text{prec}(\text{plus}) = 1$$

$$\text{prec}(s) = 0$$

$$\text{prec}(O) = 0$$

$$\text{weight}(\text{plus}) = 0$$

$$\text{weight}(s) = 1$$

$$\text{weight}(O) = 1$$

all of the following rules can be deleted.

$$\text{plus}(s(n),m) \rightarrow s(\text{plus}(n,m))$$

$$\text{plus}(O,m) \rightarrow m$$

## Beyond Straight-Forward Certification

- IsaFoR is formalization of soundness of  $CeTA$
- in particular, it contains
  - definitions of KBO, LPO, . . . ,
  - **formal proofs** that these orders have good properties, and
  - verified algorithms for checking certificates
- fact: tools often use **optimized versions** of orders, e.g.
  - quasi-precedences
  - $x \succsim c$  if  $c$  is constant with least precedence
- sometimes these “optimizations” break soundness
  - optimized RPO in AProVE was not closed under substitutions
  - optimized WPO in NaTT was not transitive
  - various incorrect versions of AC-KBO
- many of these problems have been resolved by **formal proofs**
  - design of IsaFoR: try to include all optimizations to accept many generated proofs
  - example for “optimized RPO”: add further inference rule that restores closure properties

## Certification – The Hard Direction

- sometimes a successful proof requires unsatisfiability proofs
- example: termination proofs using weighted path orders (WPO) with **max-poly interpretations**
  - assign to each  $n$ -ary function symbol a **max-polynomial**, i.e., an arithmetic expression of  $\mathcal{T}(\mathbb{N} \cup \{+, \times, \max\}, \{x_1, \dots, x_n\})$
  - example

$$\llbracket \text{if-then-else} \rrbracket(x, y, z) = \max(y, z)$$

$$\llbracket \text{Cons} \rrbracket(x, xs) = 1 + xs$$

- problem: how to check  $\forall \vec{x}. \llbracket s \rrbracket > \llbracket t \rrbracket$ , i.e., compare max-polynomials?
- solution: show that  $\neg(\llbracket s \rrbracket > \llbracket t \rrbracket)$  is **unsatisfiable**

- **normalize max-polynomials**

$$\max(x, y) + z \rightarrow \max(x + z, y + z) \quad \max(x, y) \cdot z \rightarrow \max(x \cdot z, y \cdot z)$$

result has form  $\max_{i=1}^m p_i$  where each  $p_i$  is ordinary polynomial

- transform term-constraint into formula over natural number arithmetic

$$\llbracket s \rrbracket > \llbracket t \rrbracket \iff \max_{i=1}^m p_i > \max_{j=1}^k q_j \iff \bigwedge_{j=1}^k \bigvee_{i=1}^m p_i > q_j$$

- check unsatisfiability of following formula by **verified SMT solver for LIA**

$$\neg \left( \bigwedge_{x \in \text{Vars}(s,t)} x \geq 0 \rightarrow \bigwedge_{j=1}^k \bigvee_{i=1}^m p_i > q_j \right)$$

- own solver avoids bulky certificates:  $\mathcal{O}(n^2)$  many  $>$ -compares for each WPO-constr.

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## Further Reading

- Daniel Kroening and Ofer Strichman  
Decision Procedures – An Algorithmic Point of View, Second Edition  
Texts in Theoretical Computer Science, An EATCS Series, Springer, 2016
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Proceedings SAT 2007, LNCS 4501, pp. 340–354, 2007
- René Thiemann and Christian Sternagel,  
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Proceedings TPHOLs 2009, LNCS 5674, pp. 452–468, 2009
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Proceedings CPP 2019, ACM, pp. 144–151, 2019
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Certifying the Weighted Path Order (Invited Talk)  
Proceedings FSCD 2020, LIPIcs 165, pp. 4:1–4:20, 2020