



## Program Verification

### Part 7 – Certification

René Thiemann

Department of Computer Science

#### Certification – Motivation

- situation
  - program verification is work intensive
  - verification might be too expensive for complex programs
- work-around via **certification**
  - assume there is some complex function  $f$  implemented in some program
  - property  $P(x, f(x))$  should be satisfied for all  $x$
  - to this end implement a slightly extended function  $f_e$  such that
    - $f_e(x)$  computes the pair  $(f(x), c(x))$  where  $c(x)$  is a **certificate** for input  $x$ , and
    - **certification** is possible: given  $x, f(x), c(x)$  one can check  $P(x, f(x))$  with a simple program (**certifier**), and ideally, this simple program is completely verified
- advantages of certification
  - **no need to verify the complex programs**
  - one certifier can check the certificates of many similar complex programs (assumption: common certificate format)
- disadvantages of certification
  - certificates might be refused (incorrect answers of complex programs or incomplete certifier)
  - overhead in certificate generation and checking

Certification

## Certification

#### Certification – Examples

- matrix-matrix multiplication:  $f(A, B) = A \times B$ 
  - no certification possible, just computation
- matrix-inversion:  $f(A) = A^{-1}$  (for invertible inputs  $A$ )
  - certification possible without extra information
  - given  $A$  and  $A^{-1}$  it suffices to check  $AA^{-1} = I$
  - matrix multiplication is easier to verify than an algorithm for matrix inversion
- SAT solving:  $f(\varphi) = (\exists \alpha. \llbracket \varphi \rrbracket_\alpha = \top)$  for CNFs  $\varphi$ 
  - certification possible for positive answers: provide  $\alpha$
  - certification possible for negative answers: provide resolution proof
  - common format is (variant of) DRAT (used in SAT competitions)
  - several independent certifiers; some of them are verified
- Termination analysis:  $f(R) = SN(\rightarrow_R)$ 
  - certification possible: provide applied techniques with parameters and extra information
  - common format is CPF (used in termination competitions)
  - one certifier: **CeTA** (developed in Innsbruck)

Certification

## Reduction Pairs

- task of termination analysis tool: find reduction pair such that constraints are satisfied
- task of certifier: given reduction pair, check that constraints are oriented
- different complexity of both tasks
  - only tool: choose suitable class of reduction pairs
  - only certifier: verify reduction pair properties of each class
  - lexicographic path order (LPO)
    - search parameters: NP-complete; checking constraints: P
  - Knuth-Bendix Order (KBO)
    - search parameters: P (complex algorithm); checking constraints: P (trivial algorithm)
  - linear polynomial interpretations
    - search parameters: undecidable; checking constraints: P

## Certificates for Applying Reduction Pairs

- question of format of certificate for (iterated) reduction pair application
- obvious idea: just provide parameters of pairs
- example
  - consider termination problem with 5 dependency pairs (DP 1 – DP 5)
  - termination tool internally applies
    - RP 1, a **polynomial** interpretation with certain parameters P 1, to remove DP 2 and DP 3,
    - then RP 2, some **KBO** with certain parameters P 2, to remove DP 1 and DP 4,
    - and finally RP 3, some other **polynomial** interpretation with parameters P 3 to remove DP 5
  - structure of certificate
    - Poly(P 1); KBO(P 2); Poly(P 3)
- problem in case of rejected certificates (e.g., if tool uses tuned version of some RP)
  - certifier might replay this proof, but remains with DP 1 in the end
  - with above certificate structure, it is not possible to localize failure
- easy solution: add more information into certificate
  - Poly(P 1, delete DP 2,3); KBO(P 2, delete DP 1,4); Poly(P 3, delete DP 5)

## Usable Equations

- task of termination analysis tool: compute usable equations to setup constraints
- task of certifier: given usable equations, check that these have been computed correctly
- reminder: let  $\mathcal{E}$  be equations of program, let  $\mathcal{P}$  be a set of dependency pairs; define  $\mathcal{U}(\mathcal{P}) = \bigcup_{s \rightarrow t \in \mathcal{P}} \mathcal{U}(t)$  where  $\mathcal{U}(t)$  is defined inductively as

$$\frac{t \triangleright u \quad \ell = r \in \mathcal{E} \quad \text{root}(u) = \text{root}(\ell)}{\ell = r \in \mathcal{U}(t)}$$

$$\frac{\ell' = r' \in \mathcal{U}(t) \quad \ell = r \in \mathcal{U}(r')}{\ell = r \in \mathcal{U}(t)}$$

- difficulties
  - computing usable equations is a fixpoint algorithm (add new usable equations until nothing more is detected)
  - verification of fixpoint algorithms is sometimes tricky
  - tools implement different versions of usable equations (mixture of various optimizations, e.g., inclusion of argument filters, etc.)
- there is not **the** definition of usable equations
  - solution: certifier allows over-approximation of those usable equations that have been verified

## Computation of Usable Equation (Non-Optimized Version)

- $\mathcal{U}(\mathcal{P}) = \bigcup_{s \rightarrow t \in \mathcal{P}} \mathcal{U}(t)$  where  $\mathcal{U}(t)$  is defined inductively as

$$\frac{t \triangleright u \quad \ell = r \in \mathcal{E} \quad \text{root}(u) = \text{root}(\ell)}{\ell = r \in \mathcal{U}(t)}$$

$$\frac{\ell' = r' \in \mathcal{U}(t) \quad \ell = r \in \mathcal{U}(r')}{\ell = r \in \mathcal{U}(t)}$$

- inductive definition:  $\mathcal{U}(t)$  is least set such that inference rules are satisfied
- soundness proof reveals:  $\mathcal{U}(t)$  can be any set such that inference rules are satisfied
- certification
  - demand that  $\mathcal{U}(\mathcal{P})$  is provided in certificate
  - certification: check that above inference rules are satisfied
  - much easier than computing  $\mathcal{U}(\mathcal{P})$  in verified way

## Soundness Proof for Certification: Being Closed under Usable Equations

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- fix  $\mathcal{U}$  and  $\mathcal{E}$
- definition:  $t$  is closed under usable rules ( $closed(t)$ ) if

$$\forall u. t \triangleright u \longrightarrow \ell = r \in \mathcal{E} \longrightarrow root(u) = root(\ell) \longrightarrow \ell = r \in \mathcal{U}$$

- lemma: assume  $\forall \ell = r \in \mathcal{U}. closed(r)$ ; then

$$(\forall x. NF(\sigma(x)) \longrightarrow closed(t) \longrightarrow t\sigma \xrightarrow{\mathcal{E}}^* u \longrightarrow t\sigma \xrightarrow{\mathcal{U}}^* u$$

by induction on (number of steps, size of  $t$ )

- remark: conditions in lemma (being closed) are easy to check
- proof case 1: assume  $t\sigma \xrightarrow{\mathcal{E}}^* \ell\delta \xrightarrow{\mathcal{E}} r\delta \xrightarrow{\mathcal{E}}^* u$  where  $\ell\delta \xrightarrow{\mathcal{E}} r\delta$  is first root step
  - by assumptions  $root(t\sigma) = root(t) = root(\ell)$ , hence  $\ell = r \in \mathcal{U}$  and thus  $closed(r)$
  - via IH obtain  $t\sigma \xrightarrow{\mathcal{U}}^* \ell\delta$  and  $r\delta \xrightarrow{\mathcal{U}}^* u$
- proof case 2: assume  $t\sigma = f(t_1\sigma, \dots, t_n\sigma) \xrightarrow{\mathcal{E}}^* f(u_1, \dots, u_n) = u$  (only non-root steps)
  - by definition  $closed(t_i)$  and IH yields  $t_i\sigma \xrightarrow{\mathcal{U}}^* u_i$  for all  $1 \leq i \leq n$

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9/17

## Nontermination via Loops

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- a **loop** is a reduction of form  $t \leftrightarrow^+ D[t\delta]$
- whenever program admits a loop, then it is non-terminating

$$t \leftrightarrow^+ D[t\delta] \leftrightarrow^+ D[D[t\delta]\delta] \leftrightarrow^+ D[D[D[t\delta]\delta]\delta] \leftrightarrow^+ \dots$$

- certificate of non-termination: provide  $t, D, \delta$  and  $t = t_1 \leftrightarrow t_2 \leftrightarrow \dots \leftrightarrow t_n = D[t\delta]$
- certification needs to check that every step is correct: given  $t_i$  and  $t_{i+1}$ , ensure  $t_i \leftrightarrow t_{i+1}$
- approach 1: verified algorithm to compute all successors of  $t_i$ 
  - requires verified matching algorithm, etc.
- approach 2: certificate contains additional information
  - require for every step  $\ell = r \in \mathcal{E}, C$  and  $\sigma$  such that

$$t_i = C[\ell\sigma] \wedge t_{i+1} = C[r\sigma]$$

- then only the latter needs to be checked by certifier
- disadvantage: bulky certificates, more tedious to generate
- approach 3: unverified algorithm in certifier computes  $\ell = r, C$ , and  $\sigma$  for each  $t_i \leftrightarrow t_{i+1}$

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10/17

## Partially Verified Programs

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- approach 3 on previous slide contains interesting idea
- verified programs can use unverified sub-algorithms to generate auxiliary information to simplify checking task
- this approach is used in big verified programs
- example: verified C compiler (CompCert)
  - correctness of C compiler has been formally verified
    - for every C program P, if  $compiler(P) = A$  (assembly-code), then P and A are equivalent
  - many sub-algorithms of C compiler are fully verified
  - some algorithms use unverified programs to compute information that is then certified
  - if any of these unverified programs delivers faulty information, then compilation just fails

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11/17

## Example: Call-Graph Analysis

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- during compilation, call-graph needs to be computed
- compilation handles each block of mutually recursive functions separately
- blocks correspond to **strongly connected components** (SCCs) of call-graph
- instead of verifying SCC algorithm, design certificate approach
- w.l.o.g., we consider graphs  $G$  where every node has a self-loop (no distinction between SCC  $\{n\}$  and a node  $n$  that is not on any SCC)
- over-approximation
  - certificate contains list of SCC in **topologic order**  $C_1, C_2, \dots$
  - check that all nodes are covered by some  $C_i$
  - topologic order: whenever  $i < j$  then there is no edge from  $C_i$  to  $C_j$
  - remark: many SCC-algorithms actually compute SCCs in (reverse) topological order
  - easy to verify: whenever  $S$  is SCC, then  $S \subseteq C_i$  for some  $i$ 
    - SCCs are non-empty, so pick some  $s \in S$  and obtain  $i$  such that  $s \in C_i$
    - now pick some arbitrary  $t \in S$ , hence  $(s, t) \in G^*$  and  $(t, s) \in G^*$
    - then obtain  $j$  such that  $t \in C_j$
    - by topological order, obtain  $j \geq i$  from  $(s, t) \in G^*$  and similarly  $i \geq j$ , so  $j = i$
    - hence  $t \in C_i$ , and by arbitrary choice of  $t, S \subseteq C_i$

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12/17

## SCC Certification

- potential certificate for under-approximation
  - for each  $C_i$  in certificate, provide a cyclic path that contains all nodes of  $C_i$
  - easy to certify and obviously correct
  - lemma: whenever criterion is satisfied, then each  $C_i$  is strongly connected
  - format of certificate is not optimal, cf. proseminar
- for some properties, it is not required to check minimality of components

## Example – Completion

- task of completion: convert set of equations  $\mathcal{E}$  into program  $\mathcal{R}$  such that
  - $\mathcal{R}$  is confluent and terminating
  - $s =_{\mathcal{E}} t$  iff  $s \downarrow_{\mathcal{R}} = t \downarrow_{\mathcal{R}}$
- certificate contains
  - proof of confluence and termination of  $\mathcal{R}$
  - proofs of  $\ell =_{\mathcal{E}} r$  for each  $\ell = r \in \mathcal{R}$
- the latter proofs are obtained via recording completion
  - new equations  $s = t$  are produced by overlapping two known equations  $s =_{\mathcal{E}'} u =_{\mathcal{E}'} t$  for intermediate set of equations  $\mathcal{E}'$
  - memoize for each generated equation how it has been produced
  - final  $\mathcal{R}$  is just a subset of set of all equations that have been generated
  - expand each  $\mathcal{R}$  until original equations are used
- problem: size of expansion might grow exponentially

## Example Completion Run

- $\mathcal{E}$  consists of

$$f(s(x), y) = f(x, c(y, y)) \quad (1)$$

$$f(0, y) = g(y) \quad (2)$$

$$g(e) = t \quad (3)$$

$$\text{and}(g(y), g(y)) = g(c(y, y)) \quad (4)$$

$$\text{and}(t, t) = t \quad (5)$$

$$\text{start} = f(s(s(0))), e \quad (6)$$

and we derive

$$g(c(e, e)) \stackrel{4}{=} \text{and}(g(e), g(e)) \stackrel{3}{=} \text{and}(t, t) \stackrel{5}{=} t \quad (7)$$

$$g(c(c(e, e), c(e, e))) \stackrel{4}{=} \text{and}(g(c(e, e)), c(e, e)) \stackrel{7}{=} \text{and}(t, t) \stackrel{5}{=} t \quad (8)$$

$$g(c(c(c(e, e), c(e, e)), c(e, e))) \stackrel{4}{=} \text{and}(\dots, \dots) \stackrel{8}{=} \text{and}(t, t) \stackrel{5}{=} t \quad (9)$$

$$\text{start} \stackrel{6}{=} f(s(s(0))), e \stackrel{1,2}{=} g(c(\dots), c(\dots)) \stackrel{9}{=} t \quad (10)$$

## Improved Certification for Completion

- do not fully expand to original equations, but allow (and certify) intermediate equations

## Current Bachelor Project

- design automation and certificate format for similar task: rewriting induction

## Summary

- certification is often, but not always applicable
- design of certificate format is crucial
  - should contain enough information to simplify certification task
  - should be easy to generate for tools
- certification approach can be used within fully verified programs: invoke unverified programs to enrich/generate certificates on the fly, to avoid task of full verification of complex algorithm