

Formalization of Termination of Recursive Functions

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Introduction

PVS0

Terminating PVS0 Programs

TCC Termination

Size-Change Principle

Calling Context Graphs

Matrix Weighted Graphs

Termination Analysis by CCG+MWG+Dutle's Procedure

A Note on Computability

Termination

- ▶ In computer science, *termination* is the quintessential example of a property that is undecidable.
- ▶ In 1939, Turing proved that it is impossible to construct an algorithm that decides whether or not another algorithm terminates on a given input [Tur37].
- ▶ Turing's proof applies to algorithms written as Turing machines, but the proof extends to other formalisms for expressing computations: λ -calculus, rewriting systems, computer programs.

Termination in Rewriting Systems

- ▶ Termination is a fundamental property of rewriting systems, e.g., confluence is decidable in terminating systems.
- ▶ Termination is undecidable even when a rewrite system consists of only one rule.
- ▶ Several syntactic and semantic techniques are available to prove termination of rewriting systems.
- ▶ This lecture focuses on termination of **recursive functions specified in proof assistants**.

Termination in Proof Assistants

- ▶ Termination is a meta-theoretical property in most interactive theorem provers, e.g.,
 - ▶ Termination is guaranteed for well-typed functions.
 - ▶ Termination is guaranteed for functions satisfying some constraints.
 - ▶ Termination is guaranteed for functions satisfying some semantic conditions.
- ▶ Once a definition of a function f is accepted by a proof assistant, the statement “For every value a the computation of $f(a)$ terminates” is assumed to hold.
- ▶ Our proof assistant of choice: SRI's Prototype Verification System (PVS).²

²<https://pvs.csl.sri.com>.

- ▶ PVS is an interactive theorem prover based on classical higher-order logic.
- ▶ PVS provides a strongly-typed specification language that supports predicate sub-typing, dependent types, inductive data types, parametric theories, etc.
- ▶ PVS is extensively used at NASA in the verification of safety-critical and mission-critical systems.³
- ▶ The NASA PVS Library consists of more than 20K lemmas (including the formalization presented in this lecture).⁴

³<https://shemesh.larc.nasa.gov/people/cam/FM>.

⁴<https://shemesh.larc.nasa.gov/fm/ftp/larc/PVS-library/>.

Recursive Functions in PVS

```
factorial(n:nat): RECURSIVE nat =  
  IF n = 0 THEN 1  
  ELSE n*factorial(n-1)  
  ENDIF  
MEASURE  $M$  BY  $R$ 
```

where M is a **measure**, i.e., a function from the domain of *factorial* into a type T , and R is a **well-founded relation** on T , e.g.,

- ▶ $M = \text{LAMBDA}(n:\text{nat}):n,$
- ▶ $R = \text{LAMBDA}(n,m:\text{nat}):n < m.$

Recursive Functions in PVS

The well-founded relation R is usually “ $<$ ” on natural numbers. In this case, it can be written

```
factorial(n:nat): RECURSIVE nat =  
  IF n = 0 THEN 1  
  ELSE n*factorial(n-1)  
  ENDIF  
MEASURE n
```

PVS produces the following Termination Correctness Condition:⁵

```
factorial_TCC2: OBLIGATION  
  FORALL (n: nat): n /= 0 IMPLIES n - 1 < n
```

⁵This TCC corresponds to the so called Turing Termination Criterion.

Recursive Functions in PVS

```
gcd(m,n:nat) : RECURSIVE nat =  
  IF m = 0 OR n = 0 THEN m + n  
  ELSIF n >= m THEN gcd(m,n-m)  
  ELSE gcd(n,m)  
  ENDIF  
MEASURE ?
```

Recursive Functions in PVS

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gcd(m,n:nat) : RECURSIVE nat =  
  IF m = 0 OR n = 0 THEN m + n  
  ELSIF n >= m THEN gcd(m,n-m)  
  ELSE gcd(n,m)  
  ENDIF  
MEASURE lex2(m,n)
```

In this case,

- ▶ T , the range of `lex2` is ordinal.
- ▶ R , the well-founded relation, is $<$ on ordinals.

Termination Correctness Conditions for *gcd*

`gcd_TCC2: OBLIGATION`

`FORALL (m, n: nat):`

`n >= m AND NOT m = 0 AND NOT n = 0 IMPLIES`

`lex2(m, n - m) < lex2(m, n)`

`gcd_TCC3: OBLIGATION`

`FORALL (m, n: nat):`

`NOT n >= m AND NOT m = 0 AND NOT n = 0 IMPLIES`

`lex2(n, m) < lex2(m, n)`

- ▶ `factorial_TCC2`, `gcd_TCC2`, and `gcd_TCC3` are automatically discharged by PVS.
- ▶ In general, the user has to provide the measure, the well-founded relation, and prove the TCCs.

Research Objectives

- ▶ Formalize in PVS different termination criteria and prove their equivalence, e.g., Turing termination [Tur89], size change principle [LJB01, TG03, KST⁺11], calling context graphs [MV06], matrix-weighted graphs [Ave15], and dependency pairs [Art96, YSTK16, AG00].
- ▶ Use these criteria to specify terminating recursive functions in PVS and automatically discharge Termination Correctness Conditions.
- ▶ Study meta-theoretical properties related to termination and computability of PVS recursive functions.

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PVS0: A Simple Computational Model

- ▶ PVS0 is a deep embedding of first-order PVS functions of type $T \rightarrow T$, where T is a parametric type.
- ▶ PVS0 functional expressions consists of
 - ▶ Constant values of type T .
 - ▶ A variable symbol of type T .
 - ▶ Unary and binary “built-in” operators.
 - ▶ If-then-else expressions.
 - ▶ Recursive calls.
- ▶ PVS0 is simple, but not minimal. In particular, it enables the use of arbitrary PVS functions of types $T \rightarrow T$ and $T \times T \rightarrow T$ as built-in atomic operators.

PVS0 Expressions

- ▶ PVS0 expressions e have the following form:

$\text{cnst}(v) \mid \text{vr} \mid \text{op1}(n, e) \mid \text{op2}(n, e, e) \mid \text{rec}(e) \mid \text{ite}(e, e, e)$,
where v is a value of type T and $n \in \mathbb{N}$.

- ▶ In PVS, it is defined using the following abstract data type.

`PVS0Expr[T:TYPE+] : DATATYPE`

`BEGIN`

`cnst(get_val:T) : cnst?`

`vr : vr?`

`op1(get_op:nat, get_arg:PVS0Expr) : op1?`

`op2(get_op:nat, get_arg1, get_arg2:PVS0Expr) : op2?`

`rec(get_arg:PVS0Expr) : rec?`

`ite(get_cond, get_if, get_else:PVS0Expr) : ite?`

`END PVS0Expr`

PVS0 Programs

Given a concrete type Val , which instantiates T , a PVS0 program with values in Val is a 4-tuple of the form (O_1, O_2, \perp, e) , where

- ▶ O_1 is a list of PVS functions of type $Val \rightarrow Val$, where $O_1(i)$, i.e., the i -th element of the list O_1 , interprets the unary operator indexed by i in the constructor $op1$,

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- ▶ \perp is a constant of type Val representing the Boolean value false in the conditional construction `ite`, and
- ▶ e is a $PVS0Expr[Val]$, which is the syntactic representation of the program itself.

Example 1: Factorial

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factorial(n:nat): RECURSIVE nat =  
  IF n /= 0 THEN n*factorial(n-1)  
  ELSE 1  
  ENDIF
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Let $f \in \text{PVS0}[Val] = (O_1, O_2, \perp, e_f)$, where

► $Val = \text{nat}$

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- ▶ $\text{op2}(0, n, m) = n * m$
- ▶ $e_f = \text{ite}(\text{vr}, \text{op2}(0, \text{vr}, \text{rec}(\text{op1}(0, \text{vr}))), \text{cnst}(1))$

Example 2: GCD

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gcd(m,n:nat) : RECURSIVE nat =  
  IF m = 0 OR n = 0 THEN m + n  
  ELSIF n >= m THEN gcd(m,n-m)  
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- ▶ $\text{op1}(4, (m, n)) = (n, m)$

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► $e_g =$

```
ite(op1(0,vr),  
    op1(2,vr),  
    ite(op1(1,vr),  
         rec(op1(3,vr)),  
         rec(op1(4,vr))))
```


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ackermann(m,n:nat) : RECURSIVE nat =  
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- ▶ $\text{op2}(0, (m, n), (i, j)) = (\max(0, m - 1), i)$

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► $e_a =$

```
ite(op1(0,vr),  
  op1(2,vr),  
  ite(op1(1,vr),  
    rec(op1(3,vr)),  
    rec(op2(0,vr,rec(op1(4,vr))))))
```

Semantic Evaluation Relation ε

Given a PVS0 program $pvs0 = (O_1, O_2, \perp, e_{pvs0})$ of type $PVS0[Val]$, the predicate ε holds when the semantic evaluation of an expression e of type $PVS0Expr[Val]$ on the input value v_i results in the value v_o .

$$\begin{aligned}\varepsilon(pvs0)(e, v_i, v_o) &:= \text{CASES } e \text{ OF} \\ \text{cnst}(v) &: v_o = v; \\ \text{vr} &: v_o = v_i; \\ \text{op1}(j, e_1) &: j < |O_1| \wedge \exists v' \in Val : \\ &\quad \varepsilon(pvs0)(e_1, v_i, v') \wedge v_o = O_1(j)(v'); \\ \text{op2}(j, e_1, e_2) &: j < |O_2| \wedge \exists v', v'' \in Val : \\ &\quad \varepsilon(pvs0)(e_1, v_i, v') \wedge \\ &\quad \varepsilon(pvs0)(e_2, v_i, v'') \wedge \\ &\quad v_o = O_2(j)(v', v''); \\ \text{rec}(e_1) &: \exists v' \in Val : \varepsilon(pvs0)(e_1, v_i, v') \wedge \\ &\quad \varepsilon(pvs0)(e_{pvs0}, v', v_o) \\ \text{ite}(e_1, e_2, e_3) &: \exists v' : \varepsilon(pvs0)(e_1, v_i, v') \wedge \\ &\quad \text{IF } v' \neq \perp \text{ THEN } \varepsilon(pvs0)(e_2, v_i, v_o) \\ &\quad \text{ELSE } \varepsilon(pvs0)(e_3, v_i, v_o) \text{ ENDIF} .\end{aligned}$$

The Relation ε is Deterministic

Lemma 1.

Let $pvso$ be a PVS0 program of type $PVS0[Val]$. For any expression e of type $PVS0Expr[Val]$ and all values $v_i, v'_o, v''_o \in Val$,

$$\varepsilon(pvso)(e, v_i, v'_o) \text{ and } \varepsilon(pvso)(e, v_i, v''_o) \text{ implies } v'_o = v''_o.$$

The proof of this lemma uses the induction schema generated for the inductive relation ε .

Semantic Evaluation Function χ

- ▶ Given a PVS0 program $pvs0 = (O_1, O_2, \perp, e_{pvs0})$ of type $PVS0[Val]$ and a **natural number** n , representing a maximum number of recursive calls, the function χ evaluates an expression e of type $PVS0Expr[Val]$ on the input value v_i . The function returns either the undefined value \diamond or a value of type Val .
- ▶ The function χ is recursively defined on the structure of e .

The Function χ

```
 $\chi(pvso)(e, v_i, n) :=$  IF  $n = 0$  THEN  $\Diamond$  ELSE CASES  $e$  OF  
   $\text{cnst}(v) :$   $v$ ;  
   $\text{vr} :$   $v_i$ ;  
   $\text{op1}(j, e_1) :$  IF  $j < |O_1|$  THEN  
    LET  $v' = \chi(pvso)(e_1, v_i, n)$  IN  
    IF  $v' = \Diamond$  THEN  $\Diamond$  ELSE  $O_1(j)(v')$  ENDIF  
  ELSE  $\perp$  ENDIF ;  
   $\text{op2}(j, e_1, e_2) :$  IF  $j < |O_2|$  THEN  
    LET  $v' = \chi(pvso)(e_1, v_i, n)$ ,  
     $v'' = \chi(pvso)(e_2, v_i, n)$  IN  
    IF  $v' = \Diamond \vee v'' = \Diamond$  THEN  $\Diamond$  ELSE  $O_2(j)(v', v'')$  ENDIF  
  ELSE  $\perp$  ENDIF ;  
   $\text{rec}(e_1) :$  LET  $v' = \chi(pvso)(e_1, v_i, n)$  IN  
    IF  $v' = \Diamond$  THEN  $\Diamond$  ELSE  $\chi(pvso)(e_{pvso}, v', n - 1)$  ENDIF ;  
   $\text{ite}(e_1, e_2, e_3) :$  LET  $v' = \chi(pvso)(e_1, v_i, n)$  IN  
    IF  $v' = \Diamond$  THEN  $\Diamond$   
    ELSIF  $v' \neq \perp$  THEN  $\chi(pvso)(e_2, v_i, n)$   
    ELSE  $\chi(pvso)(e_3, v_i, n)$  ENDIF ;  
ENDIF
```

Equivalence of ε and χ Evaluation

Theorem 2.

Let $pvso$ be a PVS0 program of type $PVS0[Val]$. For any $v_i \in Val$ and e of type $PVS0Expr[Val]$,

$$\varepsilon(pvso)(e, v_i, v_o) \text{ if and only if } v_o = \chi(pvso)(e, v_i, n),$$

for some n , where $v_o \neq \diamond$.

Factorial, GCD, and Ackermann Lemmas

- ▶ The PVS0 program f computes the PVS function factorial, i.e., for any $n, k \in \mathbf{nat}$,

$$\text{factorial}(n) = k \text{ if and only if } \varepsilon(f)(e_f, n, k).$$

- ▶ The PVS0 program g computes the PVS function gcd, i.e., for any $n, m, k \in \mathbf{nat}$,

$$\text{gcd}(m, n) = k \text{ if and only if } \varepsilon(g)(e_g, (m, n), (k, i)),$$

for some i .

- ▶ The PVS0 program a computes the PVS function ackermann, i.e., for any $n, m, k \in \mathbf{nat}$,

$$\text{ackermann}(m, n) = k \text{ if and only if } \varepsilon(a)(e_a, (m, n), (k, i)),$$

for some i .

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ε -Termination

- ▶ The PVS0 program $pvso \in \text{PVS0}[Val]$ ε -terminates for an input $v_i \in Val$ if the following predicate holds

$$T_\varepsilon(pvso, v_i) \equiv \exists v_o \in Val : \varepsilon(pvso)(e_{pvso}, v_i, v_o).$$

- ▶ The PVS0 program $pvso$ is ε -terminating if for all $v_i \in Val$, $T_\varepsilon(pvso, v_i)$ holds.

χ -Termination

- ▶ The PVS0 program $pvso \in \text{PVS0}[Val]$ χ -terminates for an input $v_i \in Val$ if the following predicate holds

$$T_\chi(pvso, v_i) \equiv \exists n \in \text{nat} : \chi(pvso)(e_{pvso}, v_i, n) \neq \Diamond.$$

- ▶ The PVS0 program $pvso$ is χ -terminating if for all $v_i \in Val$, $T_\chi(pvso, v_i)$ holds.

Equivalence of T_ε and T_χ

Theorem 3.

Let $pvso$ be a PVS0 program of type $PVS0[Val]$. The following conditions hold:

1. For any $v_i \in Val$, $T_\varepsilon(pvso, v_i)$ if and only if $T_\chi(pvso, v_i)$.
2. $pvso$ is ε -terminating if and only if $pvso$ is χ -terminating.

A PVS0 program $pvso$ that is ε -terminating (or equivalently, χ -terminating) is said to be *terminating*, denoted $\text{terminating}(pvso)$.

Existence of Non-terminating PVS0 Programs

Lemma 4.

Let $\Delta = (O_1, O_2, \perp, \text{rec}(\text{vr}))$. For any $v \in \text{Val}$, $\neg T_\chi(\Delta, v)$.

Proof.

1. Define $\mu(\text{pvso}, v)$, for any pvso and v such that $T_\chi(\text{pvso}, v)$, as the minimum n that satisfies

$$\chi(\text{pvso})(e_{\text{pvso}}, v, n) \neq \diamond.$$

2. By contradiction, assume that $\chi(\Delta)(e_\Delta, v, n) \neq \diamond$ for some n .
3. Therefore, $\chi(\Delta)(e_\Delta, v, \mu(\Delta, v)) \neq \diamond$, by definition of μ .
4. By definition of Δ and χ , it is also the case that $\chi(\Delta)(e_\Delta, v, \mu(\Delta, v) - 1)$.
5. This is a contradiction because $\mu(\Delta, v) - 1 < \mu(\Delta, v)$.



Evaluation of Terminating PVS0 Programs

Let $pvso = (O_1, O_2, \perp, e_{pvso})$ be a terminating PVS0 program in $PVS0[Val]$, i.e., $\text{terminating}(pvso)$. The evaluation of $pvso$ on v can be defined as

$\text{pvs0_eval}(pvso)(v) \equiv \text{pvs0_eval_expr}(pvso)(e_{pvso}, v)$, where

```
pvs0_eval_expr(pvso)(e, vi) := CASES e OF
  cst(v) : v;
  vr : vi;
  op1(j, e1) : IF j < |O1| THEN
    O1(j)(pvs0_eval_expr(pvso)(e1, vi))
  ELSE ⊥ ENDIF ;
  op2(j, e1, e2) : IF j < |O2| THEN
    O1(j)(pvs0_eval_expr(pvso)(e1, vi),
    pvs0_eval_expr(pvso)(e2, vi))
  ELSE ⊥ ENDIF ;
  rec(e1) : pvs0_eval_expr(pvso)(epvso)(pvs0_eval_expr(pvso)(e1, vi))
  ite(e1, e2, e3) : LET v' = pvs0_eval_expr(pvso)(e1, vi) IN
    IF v' ≠ ⊥ THEN pvs0_eval_expr(pvso)(e2, vi)
    ELSE pvs0_eval_expr(pvso)(e3, vi) ENDIF .
```

Correctness of pvs0_eval

Theorem 5.

For all terminating programs $pvso \in \text{PVS0}[Val]$ and $v_i, v_o \in Val$, $\varepsilon(pvso)(e_{pvso}, v_i, v_o)$ if and only if $v_o = \text{pvs0_eval}(pvso)(v_i)$.

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A Syntactic Termination Criterion

- ▶ T_ε and T_χ are impractical as termination criteria since they require case by case analysis on the input to the function.
- ▶ **Turing Termination Criterion:** If there is a measure on a well-founded relation that strictly decreases at every recursive call, the function is terminating.
- ▶ This criterion, which implements a simple static analysis, requires the formalization of several syntactic elements:
 - ▶ Recursive calls.
 - ▶ Conditions.
 - ▶ Paths.

PVS0 Calling Context

A **PVS0 Calling Context** is triple (r, P, C) , where

- ▶ r is a PVS0Expr of the form $\text{rec}(e)$, where e is a PVS0Expr.
- ▶ P is a path, i.e., a list of natural numbers.
- ▶ C is a list of Boolean expressions, i.e., a PVS0Expr or a negation of a PVS0Expr.

A (r, P, C) is a **valid calling context** of $e \in \text{PVS0Expr}$ if

- ▶ r is a subexpression of e .
- ▶ P is the path of r in e ,
- ▶ C is the set of accumulated conditions for the path P .

The set of valid calling contexts of e are denoted $\text{pvs0_tcc_valid_cc}(e)$.

Valid Calling Contexts of Ackermann

```
IF m = 0 THEN n+1
ELSIF n = 0 THEN ackermann(m-1,1)
ELSE ackermann(m-1,ackermann(m,n-1))
ENDIF
```

```
ite<0>(op1<00>(0, vr<000>), op1<10>(2, vr<010>),
    ite<20>(op1<020>(1, vr<0020>), rec<120>(op1<0120>(3, vr<00120>)),
        rec<220>(op2<0220>(0, vr<00220>),
            rec<10220>(op1<0...>(4, vr<00...>))))))
```

► **cc**₁ =
(rec(op1(3, vr)), <120>, {op1(1, vr), !(op1(0, vr))}).

Valid Calling Contexts of Ackermann

```
IF m = 0 THEN n+1
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```

```
ite<0>(op1<00>(0, vr<000>), op1<10>(2, vr<010>),
      ite<20>(op1<020>(1, vr<0020>), rec<120>(op1<0120>(3, vr<00120>)),
      rec<220>(op2<0220>(0, vr<00220>),
              rec<10220>(op1<0...>(4, vr<00...>))))))
```

- ▶ $cc_1 =$
 $(\text{rec}(\text{op1}(3, \text{vr})), \langle 120 \rangle, \{\text{op1}(1, \text{vr}), !(\text{op1}(0, \text{vr}))\})$.
- ▶ $cc_2 =$
 $(\text{rec}(\text{op2}(0, \text{vr}, \dots)), \langle 220 \rangle, \{!(\text{op1}(1, \text{vr})), !(\text{op1}(0, \text{vr}))\})$.

Valid Calling Contexts of Ackermann

```
IF m = 0 THEN n+1
ELSIF n = 0 THEN ackermann(m-1,1)
ELSE ackermann(m-1,ackermann(m,n-1))
ENDIF
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```
ite<0>(op1<00>(0, vr<000>), op1<10>(2, vr<010>),
      ite<20>(op1<020>(1, vr<0020>), rec<120>(op1<0120>(3, vr<00120>)),
      rec<220>(op2<0220>(0, vr<00220>),
              rec<10220>(op1<0...>(4, vr<00...>))))))
```

- ▶ $cc_1 =$
 $(\text{rec}(\text{op1}(3, \text{vr})), \langle 120 \rangle, \{\text{op1}(1, \text{vr}), !(\text{op1}(0, \text{vr}))\})$.
- ▶ $cc_2 =$
 $(\text{rec}(\text{op2}(0, \text{vr}, \dots)), \langle 220 \rangle, \{!(\text{op1}(1, \text{vr})), !(\text{op1}(0, \text{vr}))\})$.
- ▶ $cc_3 =$
 $(\text{rec}(\text{op1}(0, \text{vr})), \langle 10220 \rangle, \{!(\text{op1}(4, \text{vr})), !(\text{op1}(0, \text{vr}))\})$.

Evaluation of Conditions

$\text{eval_conds}(pvso)(C, v_i) := \text{CASES } C \text{ OF}$

- $\text{null} : \text{ TRUE};$
- $\text{cons}(e, C') : (\exists v_o \in \text{Val} : \varepsilon(pvso)(e, v_i, v_o) \wedge v_o \neq \perp) \wedge \text{eval_conds}(pvso)(C', v_i);$
- $\text{cons}(!e, C') : (\exists v_o \in \text{Val} : \varepsilon(pvso)(e, v_i, v_o) \wedge v_o = \perp) \wedge \text{eval_conds}(pvso)(C', v_i).$

Termination Correctness Condition

- ▶ A PVS0 program $pvso \in \text{PVS0}[Val]$ satisfies the predicate $\text{pvs0_tcc_termination}(pvso)$ for a type M if and only
- ▶ There exists a function m from Val into M and a well-founded relation $<$ on M such that for all $v_i, v_o : Val$ and $(rec(e), P, C) \in \text{pvs0_tcc_valid_cc}(e_{pvso})$,
 - ▶ $\varepsilon(pvso)(e, v_i, v_o)$ and
 - ▶ $\text{eval_conds}(pvso)(C, v_i)$implies $m(v_o) < m(v_i)$.

Theorem 6.

Let $pvso$ be a PVS0 program of type $PVS0[Val]$. The predicate $pvso_tcc_termination(pvso)$ holds for a type M if and only if $terminating(pvso)$, i.e., for all $v : Val$, $T_\varepsilon(pvso, v)$ (or, equivalently, $T_\chi(pvso, v)$).

- ▶ The direction “ \leftarrow ” uses $M = \text{nat}$ and the well-founded order $<$ on natural numbers.
- ▶ The proof of this statement uses the definition of

$$\Omega_m(v) := \min(\{n : \mathbb{N}^+ \mid \forall v' \in V : \neg(m(v) >^n m(v'))\}).$$

- ▶ Intuitively, $\Omega_m(v)$ is the length of the longest path downwards starting from $m(v)$.

Ω and μ

The following lemma states a relation between μ and Ω .

Lemma 7.

Let $pvso$ be a PVS0 program that satisfies $pvso_tcc_termination(pvso)$ for a well-founded relation $<$ over M and a measure function m . For any value $v \in Val$, $\mu(pvso, v) \leq \Omega_m(v)$.

The PVS0 Ackermann Program is Terminating

Theorem 8.

The PVS0 Ackerman program $\triangleright a$ satisfies $terminating(a)$.

- ▶ By Theorem 6, it suffices to check $pvs0_tcc_termination(a)$.
- ▶ $pvs0_tcc_termination(a)$ can be checked for all the PVS0 calling contexts of a , i.e., $\triangleright \{cc_1, cc_2, cc_3\}$ using $M = [nat, nat]$ and $(a, b) < (c, d) \equiv a < c \text{ OR } (a = c \text{ AND } b < d)$.
- ▶ The proofs of these conditions correspond to the proofs of the **actual** termination correctness conditions generated by the PVS Type Checker for the PVS function *ackermann*.

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The Size-Change Principle (SCP)

SCP Termination Criterion

A program terminates on all inputs if *every infinite call sequence* (following program control flow) would cause an infinite descent (over a well-founded relation) in some data values. [LJB01].

Infinite Sequence of Computations

Let $pvso \in PVS0[Val]$, $\mathbf{cc} = (\text{rec}(e_0), P_0, C_0), \dots$ be an infinite sequence of calling contexts of $pvso$, and $\mathbf{V} = v_0, \dots$ be an infinite sequence of values in Val such that the following predicate holds.

$$\text{infinite_seq_ccs}(\mathbf{cc}, \mathbf{V}) \equiv \\ \forall(i : nat) : (\text{eval_conds}(pvso)(C_i, v_i) \text{ AND} \\ \varepsilon(pvso)(e_i, v_i, v_{i+1})).$$

Let $<$ be a well-founded relation over Val , $\text{SCP}_{<}(pvso)$ holds if for all infinite sequence \mathbf{cc} of calling contexts of $pvso$ and infinite sequence \mathbf{V} of values in Val that satisfy $\text{infinite_seq_ccs}(\mathbf{cc}, \mathbf{V})$, $v_{i+1} < v_i$ for all i .

SCP Termination Criterion

$\text{scp_termination}(pvso)$ holds if there are no infinite sequence \mathbf{cc} of calling contexts of $pvso$ and infinite sequence \mathbf{V} of values in Val that satisfy $\text{infinite_seq_ccs}(\mathbf{cc}, \mathbf{V})$.

Theorem 9.

For all $pvso \in \text{PVS0}[Val]$, $\text{terminating}(pvso)$ if and only if $\text{scp_termination}(pvso)$.

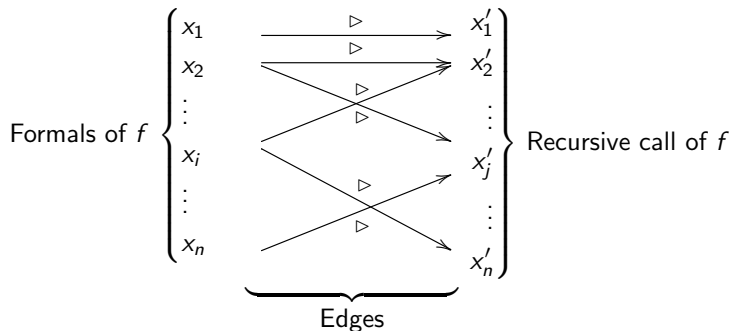
Theorem 10.

For all $pvso \in \text{PVS0}[Val]$, $\text{scp_termination}(pvso)$ if and only if $\text{SCP}_{<}(pvso)$ for a well-founded relation $<$ over Val .

Implementing SCP: Size Change Graph (SG)

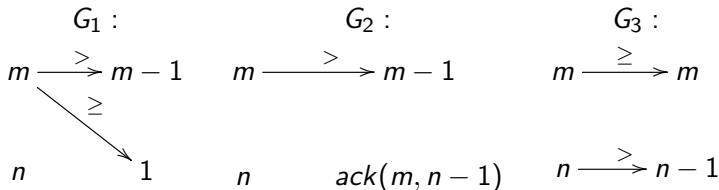
To every call c associated to a function call

$f(x_1, \dots, x_n) \xrightarrow{c} f(x'_1, \dots, x'_m)$, the graph \mathcal{G}_c is defined such that there is an edge $x_i \xrightarrow{\triangleright} x'_j$ if $x_i \triangleright x'_j$, where $\triangleright \in \{>, \geq\}$:



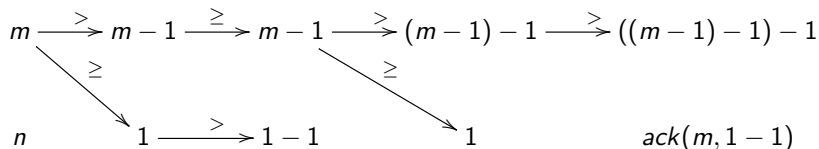
SCGs for Ackermann

$$ack(m, n) = ite(m = 0, n + 1, \\ ite(n = 0, \underbrace{ack(m - 1, 1)}_1, \\ \underbrace{ack(m - 1, 3)}_2 : \underbrace{ack(m, n - 1)}_3)))$$



Multipaths and Threads

- ▶ A **multipath** is a sequence, potentially infinite, G_{c_1}, G_{c_2}, \dots of SCGs. A multipath can be seen as a concatenated graph.
- ▶ E.g., the Ackermann sequence of calls $c_1 c_3 c_1 c_2$ yields the multipath G_1, G_3, G_1, G_2 :



Threads

- ▶ A **thread** in a multipath is a connected path of arcs

$$r_1 \xrightarrow{\triangleright_1} r_2 \xrightarrow{\triangleright_2} \dots$$

- ▶ A thread is **descending** if at least one \triangleright_i is $>$. The thread is **infinitely descending** if it contains infinitely many occurrences of $>$.
- ▶ **Size Change Principle**: A program terminates if every infinite call sequence yields an infinitely descending thread (over a well-founded order $<$).

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Calling Context Graphs (CCG)

- ▶ CCG a termination analysis technique based on the size-change principle [MV06].
- ▶ SCG Multipaths are represented by:
 - ▶ A directed graph of calling contexts,
 - ▶ where edges are labelled using a family of measures.

Calling Contexts (Reminder)

Calling contexts are a representation of recursive calls and their governing conditions.

$$\begin{aligned} \text{ack}(m, n) = & \text{ite}(m = 0, n + 1, \\ & \text{ite}(n = 0, \text{ack}(m - 1, 1), \\ & \text{ack}(m - 1, \text{ack}(m, n - 1)))) \end{aligned}$$

► $cc_1 = (\text{ack}(m - 1, 1), m \neq 0 \wedge n = 0)$

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- ▶ $cc_1 = (\text{ack}(m - 1, 1), m \neq 0 \wedge n = 0)$
- ▶ $cc_2 = (\text{ack}(m - 1, \text{ack}(m, n - 1)), m \neq 0 \wedge n \neq 0)$

Calling Contexts (Reminder)

Calling contexts are a representation of recursive calls and their governing conditions.

$$\begin{aligned} \text{ack}(m, n) = & \text{ite}(m = 0, n + 1, \\ & \text{ite}(n = 0, \text{ack}(m - 1, 1), \\ & \text{ack}(m - 1, \text{ack}(m, n - 1)))) \end{aligned}$$

- ▶ $cc_1 = (\text{ack}(m - 1, 1), m \neq 0 \wedge n = 0)$
- ▶ $cc_2 = (\text{ack}(m - 1, \text{ack}(m, n - 1)), m \neq 0 \wedge n \neq 0)$
- ▶ $cc_3 = (\text{ack}(m, n - 1), m \neq 0 \wedge n \neq 0)$

Calling Context Graph

Given a PVS0 program $pvs0 \in PVS0[Val]$, a directed graph G of is built, where

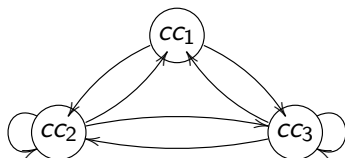
- ▶ the nodes of G are the calling contexts in $pvs0_tcc_valid_cc(e_{pvs0})$,
- ▶ there is an edge between calling contexts $(rec(e_a), P_a, C_a)$ and $(rec(e_b), P_b, C_b)$ if

$$\begin{aligned} \exists (v_a, v_b : Val) : & eval_conds(pvs0)(C_a, v_a) \text{ AND} \\ & \varepsilon(pvs0)(e_a, v_a, v_b) \text{ AND} \\ & eval_conds(pvs0)(C_b, v_b). \end{aligned}$$

- ▶ **Remark:** The above is not an “if-and-only-if” condition. Hence, a fully connected graph of calling contexts satisfies this condition.

A CCG for Ackermann

- ▶ $cc_1 = (ack(m - 1, 1), m \neq 0 \wedge n = 0)$
- ▶ $cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$
- ▶ $cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$



- ▶ There is no edge between cc_1 and itself because

$$\nexists(m, n : \text{nat}) : (m \neq 0 \wedge n = 0) \wedge (m - 1 \neq 0 \wedge 1 = 0)$$

- ▶ There is an edge between cc_2 and cc_1 even although

$$\nexists(m, n : \text{nat}) : (m \neq 0 \wedge n \neq 0) \wedge (m - 1 \neq 0 \wedge ack(m, n - 1) = 0)$$

Walks, Circuits, and Cycles

Let G_{pvso} be a CCG of a PVS0 program $pvso$ in $PVS0[Val]$.

- ▶ A **walk** of G_{pvso} is a sequence $cc_{i_1}, \dots, cc_{i_n}$ of calling contexts such that for all $1 \leq j < n$ there is an edge between cc_{i_j} and $cc_{i_{j+1}}$.
- ▶ A **circuit** is a walk $cc_{i_1}, \dots, cc_{i_n}$, with $n > 1$, where $cc_{i_1} = cc_{i_n}$.
- ▶ A **cycle** is an elementary circuit, i.e., a circuit $cc_{i_1}, \dots, cc_{i_n}$ where the only repeating nodes are cc_{i_1} and cc_{i_n} .

Measure Combination

Let \mathcal{M} be a **family** of N measures $\mu_k : Val \rightarrow M$, with $1 \leq k \leq N$, and $<$ be a well-founded relation over M .

- ▶ A **measure combination** of a walk $cc_{i_1}, \dots, cc_{i_n}$ is a sequence of natural numbers k_1, \dots, k_n , with $1 \leq k_j \leq N$ representing measure μ_{k_j} , such that for all $1 \leq j < n$, $v, v' \in Val$,

$$\begin{aligned} \text{eval_conds}(pvso)(C_j, v) \text{ AND } \varepsilon(pvso)(e_j, v, v') \\ \text{IMPLIES } \mu_{k_j}(v) \triangleright_j \mu_{k_{j+1}}(v'), \end{aligned}$$

where $cc_{ij} = (C_j, P_j, \text{rec}(e_j))$ and $\triangleright_j \in \{>, \geq\}$.

- ▶ A measure combination is **descending** if at least one \triangleright_j is $>$.

CCG Termination Criterion

- ▶ Let G_{pvso} be a CCG of a PVS0 program $pvso$ in $PVS0[Val]$ and \mathcal{M} be a family of N measures for a well-founded relation $<$ over a type M .
- ▶ $\text{ccg_termination}_{\mathcal{M}}(G_{pvso})$ holds if for all circuits $cc_{i_1}, \dots, cc_{i_n}$ in G_{pvso} there is a **descending** measure combination k_1, \dots, k_n , with $k_1 = k_n$.

Finding Descending Measure Combinations

$$\mu_1(m, n) = m$$

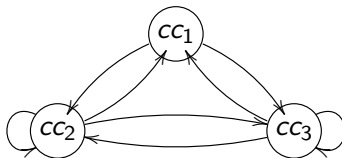
$$\mu_2(m, n) = n$$

$$\mu_1\mu_1$$

$$\mu_1\mu_2$$

$$\mu_2\mu_1$$

$$\mu_2\mu_2$$



$ack(m, n) \equiv \dots$

$$cc_1 = (ack(m-1, 1), m \neq 0 \wedge n = 0)$$

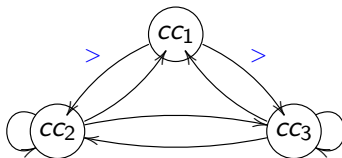
$$cc_2 = (ack(m-1, ack(m, n-1)), m \neq 0 \wedge n \neq 0)$$

$$cc_3 = (ack(m, n-1), m \neq 0 \wedge n \neq 0)$$

Finding Descending Measure Combinations

$$\begin{aligned}\mu_1(m, n) &= m \\ \mu_2(m, n) &= n\end{aligned}$$

$$\mu_1\mu_1$$



$$ack(\textcolor{blue}{m}, n) \equiv \dots$$

$$cc_1 = (ack(\textcolor{blue}{m} - 1, 1), m \neq 0 \wedge n = 0)$$

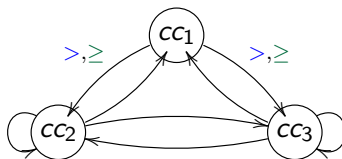
$$cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$$

$$cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$$

Finding Descending Measure Combinations

$$\begin{aligned}\mu_1(m, n) &= m \\ \mu_2(m, n) &= n\end{aligned}$$

$$\mu_1\mu_2$$



$$ack(\textcolor{teal}{m}, n) \equiv \dots$$

$$cc_1 = (ack(m - 1, \textcolor{teal}{1}), m \neq 0 \wedge n = 0)$$

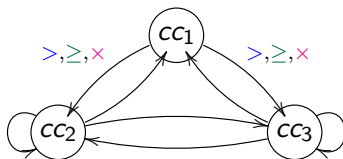
$$cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$$

$$cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$$

Finding Descending Measure Combinations

$$\begin{aligned}\mu_1(m, n) &= m \\ \mu_2(m, n) &= n\end{aligned}$$

$$\mu_2\mu_1$$



$$ack(m, n) \equiv \dots$$

$$cc_1 = (ack(m - 1, 1), m \neq 0 \wedge n = 0)$$

$$cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$$

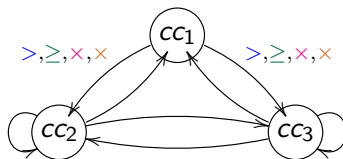
$$cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$$

Finding Descending Measure Combinations

$$\mu_1(m, n) = m$$

$$\mu_2(m, n) = n$$

$$\mu_2\mu_2$$



$$ack(m, n) \equiv \dots$$

$$cc_1 = (ack(m - 1, \textcolor{brown}{1}), m \neq 0 \wedge n = 0)$$

$$cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$$

$$cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$$

Finding Descending Measure Combinations

$$\mu_1(m, n) = m$$

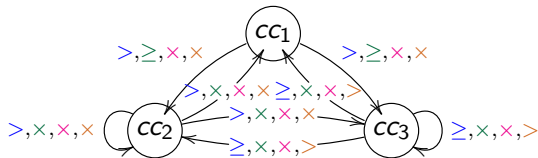
$$\mu_2(m, n) = n$$

$\mu_1\mu_1$

$\mu_1\mu_2$

$\mu_2\mu_1$

$\mu_2\mu_2$



$ack(m, n) \equiv \dots$

$cc_1 = (ack(m - 1, 1), m \neq 0 \wedge n = 0)$

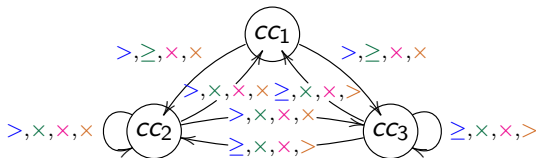
$cc_2 = (ack(m - 1, ack(m, n - 1)), m \neq 0 \wedge n \neq 0)$

$cc_3 = (ack(m, n - 1), m \neq 0 \wedge n \neq 0)$

Finding Descending Measure Combinations

$\mu_1\mu_1$ $\mu_1\mu_2$

$\mu_2\mu_1$ $\mu_2\mu_2$



- ▶ Consider the circuit $cc_1, cc_3, cc_2, cc_2, cc_1$, the measure combination 1, 1, 1, 1, 1, i.e., $>, \geq, >, >$, is descending.
- ▶ Consider the circuit cc_3, cc_3 , the measure combination 2, 2, i.e., $>$, is descending.
- ▶ The measure μ_1 is not enough to prove termination because 2, 2 is the only measure combination that is descending for cc_3, cc_3 .

CCG Termination Correctness

Theorem 11.

For all $pvso \in PVS0[Val]$, $scp_termination(pvso)$ if and only if $ccg_termination_{\mathcal{M}}(G_{pvso})$ for some CCG G_{pvso} of $pvso$ and family \mathcal{M} of measures.

- ▶ The number of cycles in a graph is finite. However, the number of circuits is potentially infinite.
- ▶ It's not enough to check for decreasing measure combinations in cycles (see [Ave15]).

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Matrix Weighted Graphs

- ▶ Matrix Weighted Graphs is an effective technique to check for descending measure combinations in a CCG using an algebra over matrices [Ave15].
- ▶ Every edge in a CCG is labeled with a $N \times N$ -matrix of values in $\{-1, 0, 1\}$, where N is the number of measures in \mathcal{M} .

Matrix Weighted Graph (MWG)

- ▶ Let G_{pvso} be a CCG of a PVS0 program $pvso$ in $PVS0[Val]$ and \mathcal{M} be a family of N measures.
- ▶ A **matrix weighted graph** (MWG) W_{pvso} of a PVS0 program $pvso$ in $PVS0[Val]$ consists of a CCG G_{pvso} whose edges are **correctly** labeled by $N \times N$ -matrices of values $\{-1, 0, 1\}$.

Correct Labels

\mathbf{M}_{ab} is a **correct label** of an edge cc_a, cc_b in G_{pvso} if and only if for all $1 \leq i, j \leq N$ one of the following cases holds:

- ▶ $\mathbf{M}_{ab}(i, j) = 1$ only if for all $v_a, v_b \in Val$,

$$\begin{aligned} \text{eval_conds}(pvso)(C_a, v_a) \text{ AND } \varepsilon(pvso)(e_a, v_a, v_b) \\ \text{IMPLIES } \mu_i(v_a) > \mu_j(v_b). \end{aligned}$$

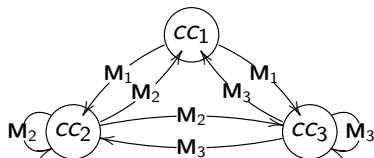
- ▶ $\mathbf{M}_{ab}(i, j) = 0$ only if for all $v_a, v_b \in Val$,

$$\begin{aligned} \text{eval_conds}(pvso)(C_a, v_a) \text{ AND } \varepsilon(pvso)(e_a, v_a, v_b) \\ \text{IMPLIES } \mu_i(v_a) \geq \mu_j(v_b). \end{aligned}$$

- ▶ $\mathbf{M}_{ab}(i, j) = -1$.

A MWG for Ackermann

- ▶ $cc_1 = (ack(m-1, 1), m \neq 0 \wedge n = 0)$
- ▶ $cc_2 = (ack(m-1, ack(m, n-1)), m \neq 0 \wedge n \neq 0)$
- ▶ $cc_3 = (ack(m, n-1), m \neq 0 \wedge n \neq 0)$
- ▶ $\mu_1(m, n) = m$
- ▶ $\mu_2(m, n) = n$



$$\mathbf{M}_1 = \begin{bmatrix} 1 & 0 \\ -1 & -1 \end{bmatrix}$$

$$\mathbf{M}_2 = \begin{bmatrix} 1 & -1 \\ -1 & -1 \end{bmatrix}$$

$$\mathbf{M}_3 = \begin{bmatrix} 0 & -1 \\ -1 & 1 \end{bmatrix}$$

Basic Operations

- ▶ Let x, y be in $\{-1, 0, 1\}$.

$$x \times y = \begin{cases} -1 & \text{if } x = -1 \vee y = -1 \\ 1 & \text{if } x = 1 \vee y = 1 \\ 0 & \text{otherwise.} \end{cases}$$

$$x + y = \max(x, y).$$

- ▶ Matrix multiplication of values in $\{-1, 0, 1\}$ is defined as usual where addition and multiplication of values is defined as above.

Weight of Walk

- ▶ The **weight** of a walk $cc_{i_1}, \dots, cc_{i_n}$ of a matrix weighted graph \mathcal{W}_{pvso} is defined as $\prod_{j=1}^{n-1} \mathbf{M}_{i_j i_{j+1}}$.
- ▶ A weight \mathbf{M} is **positive** if there exists $1 \leq j \leq N$ such that $\mathbf{M}(i, i) > 0$.

MWG Termination Criterion

- ▶ Let W_{pvso} be a MWG of a PVS0 program $pvso$ in $PVS0[Val]$ and \mathcal{M} be a family of N measures for a well-founded relation $<$ over a type M .
- ▶ $\text{mwg_termination}_{\mathcal{M}}(W_{pvso})$ holds if all circuits in W_{pvso} have a positive weight.
- ▶ **Dutle's Procedure:**
 - ▶ A sound and complete effective procedure to decide positive weight of all circuits in a CCG.
 - ▶ Formally verified in PVS.

Theorem 12.

For all $pvso \in PVS0[Val]$, $\text{ccg_termination}_{\mathcal{M}}(G_{pvso})$ for some CCG G_{pvso} if and only if $\text{mwg_termination}_{\mathcal{M}}(W_{pvso})$ for some MWG W_{pvso} .

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Termination Analysis by CCG

- ▶ How to build a CCG?
- ▶ Which well-founded relation?
- ▶ Which family of measures?
- ▶ How to build the matrices?
- ▶ How to check for positive weight of all circuits in a CCG?
- ▶ How is CCG integrated into PVS?

How to Build a CCG

- ▶ The set of calling contexts is finite and can be extracted from the program by syntactic analysis.
- ▶ A fully connected CCG is **sound** (of course, the more edges the more inefficient the method).
- ▶ The theorem prover can be used to **soundly** remove edges from the graph, i.e., an edge cc_a, cc_b can be removed if

$$\begin{aligned} \vdash \forall (v_a, v_b : Val) : \text{eval_conds}(pvso)(C_a, v_a) \text{ AND} \\ \varepsilon(pvso)(e_a, v_a, v_b) \text{ IMPLIES} \\ \text{NOT eval_conds}(pvso)(C_b, v_b). \end{aligned}$$

can be discharged.

Which well-founded relation? Which family of measures?

- ▶ The order relation $<$ over natural numbers is a good starting point.
- ▶ Since CCG allows for a family of measures, it is **sound** to add as many measures as possible (of course the more measures the more inefficient the method).
- ▶ Predefined functions can be used, e.g., parameter projections (in the case of natural numbers), natural size of parameters (in the case of data types), maximum/minimum of parameters, etc. More complex recursions may need heuristics based on static analysis.
- ▶ Manolios and Vroon report that “[CCG] was able to automatically prove termination for over **98%** of the more than 10,000 functions in the regression suite [of ACL2s]” [MV06].

How to Build the Matrices

- ▶ All edges starting in a given a calling context cc_a are labelled with the same matrix \mathbf{M}_a .
- ▶ To build a matrix \mathbf{M}_a for the edges starting in cc_a , it is **sound** to set all its entries to -1.
- ▶ The theorem prover can be used to **soundly** reset the entries in $\mathbf{M}_a(i, j)$ to either 0 or 1 as follows,

▶ If

$$\vdash \forall (v_a, v_b : Val) : \text{eval_conds}(pvso)(C_a, v_a) \text{ AND} \\ \varepsilon(pvso)(e_a, v_a, v_b) \text{ IMPLIES } \mu_i(v_a) > \mu_j(v_b),$$

can be discharged then set $M_a(i, j)$ to 1.

▶ If

$$\vdash \forall v_a, v_b : Val) : \text{eval_conds}(pvso)(C_a, v_a) \text{ AND} \\ \varepsilon(pvso)(e_a, v_a, v_b) \text{ IMPLIES } \mu_i(v_a) \geq \mu_j(v_b),$$

can be discharged, then set $M_a(i, j)$ to 0.

How to check for positive weight of all circuits in a CCG

Use Dutle's procedure!

PVS Development

- ▶ The development presented in this lecture is fully formalized in PVS (including Dutle's procedure).
- ▶ For reference, see CCG and PVS0 in NASA PVS Library (<https://github.com/nasa/pvslib>).
- ▶ In particular, it's formally verified that the following termination criteria are all equivalent: ε -termination, χ -termination, `pvs0_tcc_termination`, $\text{SCP}_{<}$, `scp_termination`, `cgc_termination` _{\mathcal{M}} , `mwg_termination` _{\mathcal{M}} , and Dutle's procedure.

Howe is CCG Being Integrated into PVS

```
ack(m,n:nat) : RECURSIVE nat =
  IF m = 0 THEN n+1
  ELSIF n = 0 THEN ack(m-1,1)
  ELSE ack(m-1, ack(m,n-1))
  ENDIF
MEASURE AUTO BY CCG
```

```
pvs0_ack : PVS0 = (false_val,
  ack_op1,ack_op2,
  ite(op1(0,vr), op1(2,vr),
  ite(op1(1,vr),rec(op1(3,vr)),
  rec(op2(0,vr,rec(op1(4,vr)))))))
```

```
mu1(m,n:nat):m
mu2(m,n:nat):n
```

M1:

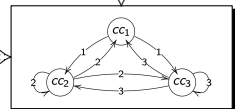
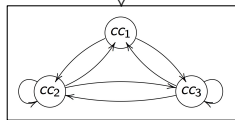
1	0
-1	-1

M2:

1	-1
-1	-1

M3:

0	-1
-1	1



Dutt's Procedure.

Howe is CCG Being Integrated into PVS

```
ack(m,n:nat) : RECURSIVE nat =
  IF m = 0 THEN n+1
  ELSIF n = 0 THEN ack(m-1,1)
  ELSE ack(m-1, ack(m,n-1))
  ENDIF
MEASURE AUTO BY CCG
```

```
pvs0_ack : PVS0 = (false_val,
  ack_op1,ack_op2,
  ite(op1(0,vr), op1(2,vr),
  ite(op1(1,vr),rec(op1(3,vr)),
  rec(op2(0,vr,rec(op1(4,vr)))))))
```

```
mu1(m,n:nat):m
mu2(m,n:nat):n
```

M1:

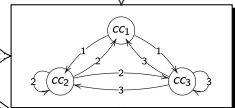
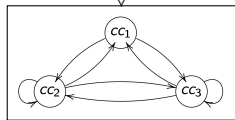
1	0
-1	-1

M2:

1	-1
-1	-1

M3:

0	-1
-1	1



Dutle's Procedure.

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$PVS \subseteq PVS0$

By design, the PVS0 language can directly encode any PVS function f of type $T \rightarrow T$, where T is an arbitrary PVS type.

Lemma 13.

Let f be a PVS function of type $T \rightarrow T$. The program $mk_pvs0(f) = (O_1, O_2, \perp, e_f)$ of type PVS0, where $e_f = \text{op1}(0, \text{vr})$ and $O_1(0)(t) = f(t)$, satisfies the following properties:

- ▶ *terminating*($mk_pvs0(f)$), i.e., for any $t \in T$, $T_\varepsilon(mk_pvs0(f), t)$.
- ▶ $f = pvs0_eval(mk_pvs0(f))$, i.e., for any $t \in T$, $f(t) = pvs0_eval(mk_pvs0(f))(t)$.

PVS0 $\not\subseteq$ PVS

Some PVS0 programs cannot be embedded as PVS functions.

Lemma 14.

Let T be non-empty type. There is no PVS function f of type $T \rightarrow T$ such that for any $t \in T$, $\varepsilon(\Delta)(e_\Delta, t, f(t))$, where Δ is the PVS0 program defined in Lemma 4.

$$\text{PVS0} \subseteq \text{PVS} \cup \{\diamond\}$$

However, any PVS0 program, even non-terminating ones, can be encoded as a PVS function of type $T \rightarrow T \cup \{\diamond\}$.

Lemma 15.

Let $pvso$ be a, possibly non-terminating, program of type PVS0 and e_{pvso} the PVS0 expression of $pvso$. The PVS function

$$f(t) := \text{IF } T_{\chi}(pvso, t) \text{ THEN } \chi(pvso)(e_{pvso}, t, \mu(pvso, t)) \\ \text{ELSE } \diamond \text{ ENDIF ,}$$

satisfies the following property for any $t_i, t_o \in T$:

$$\varepsilon(pvso)(e_{pvso}, t_i, t_o) \text{ if and only if } f(t_i) = t_o.$$

An Oracle for PVS0 Programs

It is possible to define an oracle of type $\text{PVS0}[\text{PVS0}[Val]]$ that decides if a program of type $\text{PVS0}[Val]$ is terminating or not.

Theorem 16.

The program Oracle = (O_1, O_2, \perp, e) of type $\text{PVS0}[\text{PVS0}[Val]]$, where

$$e = mk_pvs0(\text{LAMBDA}(pvso : \text{PVS0}[Val]) : \\ \text{IF } terminating(pvso) \text{ THEN } \top \text{ ELSE } \perp \text{ENDIF}),$$

with $\perp \neq \top$, has the following properties.

- ▶ *Oracle is a terminating $\text{PVS0}[\text{PVS0}[Val]]$ program, i.e., for all $pvso$ of type $\text{PVS0}[Val]$, $T_\varepsilon(\text{Oracle}, pvso)$.*
- ▶ *Oracle decides termination of any $\text{PVS0}[Val]$ program, i.e., for all $pvso$ of type $\text{PVS0}[Val]$,*

$$\chi(\text{Oracle})(e, pvso, \mu(\text{Oracle}, pvso)) = \top \text{ if and only if } T_\varepsilon(pvso).$$

An Oracle for PVS0 Programs

- ▶ This counterintuitive result is possible because PVS, in contrast to proof assistants based on constructive logic, allows for the definition of total functions that are non-computable, e.g.,

$$\text{LAMBDA}(pvso : \text{PVS0}[Val]) : \\ \text{IF } \text{terminating}(pvso) \text{ THEN } \top \text{ ELSE } \perp \text{ENDIF} .$$

- ▶ These non-computable functions can be used in the construction of terminating PVS0 programs through the built-in operators.

Partial Recursive PVS0 Programs

Formalizing the notion of partial recursive functions in PVS0 requires to restrict the way in which programs are built.

1. The parametric type T is set to \mathbb{N} , i.e., $Val = \mathbb{N}$, where the number 0 represents the value false, i.e., $\perp = 0$. Any value different from 0 represents a true value, in particular $\top = 1$.
2. The built-in operators used in the construction of programs are restricted by a hierarchy of levels:
 - ▶ Operators in the first level can only be defined using
 - ▶ projections ($\Pi_1(x, y : \mathbb{N}) := x$ and $\Pi_2(x, y : \mathbb{N}) := y$),
 - ▶ successor ($succ(x : \mathbb{N}) : x + 1$), and
 - ▶ greater or equal than functions.
 - ▶ Operators in higher levels can only be constructed using programs from the previous level.

Partial Recursive PVS0 Programs

A hierarchy of $\text{PVS0}[nat]$ program levels is formalized by the following predicate.

$$\begin{aligned} & pvs0_level(n)(O_1, O_2, \perp, e) := \\ & \text{IF } n = 0 \text{ THEN } O_1 = \langle succ \rangle \wedge O_2 = \langle \Pi_1, \Pi_2, ge \rangle \\ & \text{ELSE (} \exists p' \in \text{PVS0}[\mathbb{N}] : pvs0_level(n-1)(p') \wedge \\ & \quad \text{LET } (O_1', O_2', \perp', e') = p', l'_1 = |O_1'| \text{ IN} \\ & \quad |O_1| = l'_1 + 1 \wedge \\ & \quad (\forall i \in \mathbb{N} : i < l'_1 \Rightarrow O_1(i) = O_1'(i)) \wedge \\ & \quad (\forall v \in \mathbb{N} : \varepsilon(p')(e', v, O_1(l'_1)(v)))) \wedge \\ & \quad (\exists p' \in \text{PVS0}[\mathbb{N}] : pvs0_level(n-1)(p') \wedge \\ & \quad \text{LET } (O_1', O_2', \perp', e') = p', l'_2 = |O_2'| \text{ IN} \\ & \quad |O_2| = l'_2 + 1 \wedge \\ & \quad (\forall i \in \mathbb{N} : i < l'_2 \Rightarrow O_2(i) = O_2'(i)) \wedge \\ & \quad (\forall v_1, v_2 \in \mathbb{N} : \varepsilon(p')(e', \kappa_2(v_1, v_2), O_2(l'_2)(v_1, v_2)))), \end{aligned}$$

where the function κ_2 is an encoding of pairs of natural numbers onto natural numbers.

Undecidability of the Halting Problem

- ▶ The type `PartialRecursive` is defined to be a subtype of `PVS0[\mathbb{N}]` containing all the programs `pvso` such that there is a natural n for which `pvs0_level(n)(pvso)` holds.
- ▶ `Computable` is a subtype of `PartialRecursive` containing those elements that are also terminating.
- ▶ `PartialRecursive`, and thus `Computable`, are enumerable.

Theorem 17.

There exists a PVS function of type $\mathbb{N} \rightarrow \text{PartialRecursive}$ that is surjective.

- ▶ The inverse of this surjective function, denoted as κ_P , is an injective function of type $\text{PartialRecursive} \rightarrow \mathbb{N}$.

Undecidability of the Halting Problem

Theorem 18.

There is no program oracle $= (O_1, O_2, \perp, e_o)$ of type Computable such that for all $pvso = (O_1', O_2', \perp, e)$ of type PartialRecursive and for all $n \in \mathbb{N}$,

$T_\varepsilon(pvso, n)$ if and only if $\neg \varepsilon(\text{oracle})(e_o, \kappa_2(\kappa_P(pvso), n), \perp)$.

Proof.

See [RMAR⁺18].





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