

# Termination Analysis of a subset of CoreML

William Blum

[william.blum@comlab.ox.ac.uk](mailto:william.blum@comlab.ox.ac.uk)

Oxford University Computing Laboratory

BCTCS Nottingham

# Outline

- 1 Size-change Principle for first-order programs
- 2 An extension for a subset of Core ML

# First order programs

**Untyped functional language** recursion,  
if-then-else, primitive operators, single data  
type

**Call-by-value evaluation semantics:**

$\mathcal{E}[\![f]\!] \vec{x} = v$      $f$  evaluates to  $v$  on input  $\vec{x}$ ,  
 $\mathcal{E}[\![f]\!] \vec{x} = \perp$      $f$  does not terminate on input  $\vec{x}$ .

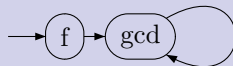
**Exact call semantics:** a computation is  
described by a state transition sequence.

**Finite approximation** of the call semantics:  
the control flow graph.

## Example

```
f(x) = gcd(x, 18)
gcd(x, y) =
  if y == 0 then x
  else gcd(y, x mod y)
```

```
f, 4 → gcd, (4, 18) →
gcd, (18, 2) →
gcd, (2, 2) → gcd, (2, 0)
```



# Termination

## Characterization of termination

P terminates on all input values

$\iff$  Infinite state transition sequences are invalid computations.

- *What is an invalid computation?*

For instance: a computation in which some positive integer variable decreases infinitely...

- *The Size-Change Principle* proves that for any computation corresponding to an infinite path in the control flow, the value of some well-founded variable decreases infinitely.

# Size-change graphs (SCG)

**Definition:** A SCG describes a program call. It consists of a **source set of vertices**, a **target set of vertices** and a set of labeled arcs.

The SCG  $\left( \begin{array}{c} x \xrightarrow{=} x \\ y \end{array} \right)$  describes the call from  $f$  to  $\text{gcd}$ .

**Safety:**  $\downarrow$  arcs denote decreases in parameter value,  $\xrightarrow{=}$  arcs denote non increase in parameter value.

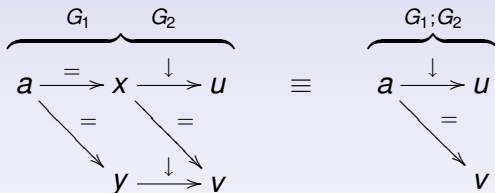
*Example:* consider the call “ $\text{gcd}(\underbrace{y}_x, \underbrace{x \bmod y}_y)$ ”:



Only one of these SCG is not safe for this call.

# Composition of size-change graphs

If  $f \xrightarrow{G_1} g$  and  $g \xrightarrow{G_2} h$  then  $f \xrightarrow{G_1; G_2} h$



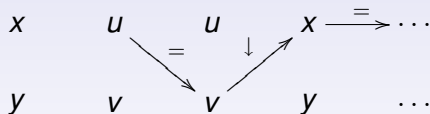
If  $\mathcal{G}$  is a set of size-change graphs then  $\overline{\mathcal{G}}$  denotes the composition closure of  $\mathcal{G}$ .

# Size-change termination (SCT)

**Definition** Consider  $\mathcal{G}$  a set of size-change graphs.

A program  $P$  is  $\mathcal{G}$ -SCT if

- $\mathcal{G}$  safely describes  $P$  (for every reachable call  $c$  there is a corresponding SCG  $G_c \in \mathcal{G}$ )
- for all infinite computation  $cs = \langle c_0 c_1 \dots \rangle$ , any sequence of size-change graphs  $G_{c_0} G_{c_1} \dots$  (describing safely the calls of  $cs$ ) has an infinite descending thread.



We assume that data-types are well-founded.

## Theorem

If  $P$  is  $\mathcal{G}$ -SCT then  $P$  terminates for all input values

# Deciding Size-Change Termination

$\mathcal{G}$ -SCT characterization [Jones et al. 2001]

$P$  is **not**  $\mathcal{G}$ -SCT

$$\begin{array}{c} \Longleftrightarrow \\ \exists f \xrightarrow{G} f \in \overline{G} \text{ such that } \left( \begin{array}{l} G; G = G \\ \forall x \in gb(f) : x \xrightarrow{\downarrow} x \notin G \end{array} \right) \end{array}$$

Hence  $\mathcal{G}$ -SCT is decidable. And it is PSPACE-complete (see [1])



# The language $\mathcal{L}_{ml}$

## Grammar:

<code>e ::= x, f</code>	value identifiers
<code>  true   false</code>	boolean constants
<code>  if e then e else e</code>	conditional
<code>  n</code>	integer constants ( $n \in \mathbb{N}$ )
<code>  e = e</code>	integer equality
<code>  succ e   pred e</code>	successor and predecessor
<code>  fun (x:ty) -&gt; e</code>	function abstraction
<code>  fun f=(x:ty) -&gt; e</code>	recursively defined function
<code>  e e</code>	function application
<code>  let x = e in e</code>	local variable definition

A program is a **single** closed expression.

**Data types:** ground values + **higher-order functions**.

# Semantics of $\mathcal{L}_{ml}$ (environment based)

*Canonical expressions:*  $\mathbb{N} \cup \mathbb{B} \cup \{e \mid e \text{ is an abstraction}\}$

*State* =  $\{e : \rho \mid e \in \text{subexp}(\mathbb{P}), \rho \in \text{Env}, \text{fv}(e) \subseteq \text{dom}(\rho)\}$

*Value* =  $\{e : \rho \in \text{State} \mid e \text{ canonical}\}$

*Env* =  $\{\rho : X \rightarrow \text{Value} \mid X \text{ finite set of variables}\}$

Let  $s \in \text{State}$ ,  $v \in \text{Value}$  and  $\rho \in \text{Env}$

**Call-by-value evaluation semantics “ $s \Downarrow v$ ”**

$$\frac{}{v : \rho \Downarrow v : \rho} (v \text{ canonical})$$

**Run-time errors “ $s \oslash$ ”** (ErrOp1)  $\frac{e : \rho \Downarrow 0}{\text{pred } e : \rho \oslash}$

**Call semantics “ $s \rightarrow s'$ ”**

$$(\text{CallG}) \frac{e_1 : \rho \Downarrow \text{fun } (x : \text{ty}) \rightarrow e_0 : \rho_0 \quad e_2 : \rho \Downarrow v_2}{e_1 e_2 : \rho \xrightarrow{\text{c}} e_0 : \rho_0 [x \mapsto v_2]}$$

# Graph generation

- Two SCG generated per call:  $G^+$  describing higher-order values and  $G^0$  for ground type values.
- The *free variables* of an expression correspond to the *input parameters* in the first-order case.
- We define well-founded notions of size for higher-order and ground type expressions.
- We extend the semantic rules to generate safe SCG:

$$(\text{ValueG}) \frac{}{v \Downarrow v, id_e^- | id_e^-} (v = e : \rho \text{ in canonical form})$$

$$(\text{CallG}) \frac{e_1 : \rho \Downarrow \text{fun } (x : ty) \rightarrow e_0 : \rho_0, G_1 | G_1^+ \quad e_2 : \rho \Downarrow v_2, G_2 | G_2^+}{e_1 e_2 : \rho \xrightarrow{c} e_0 : \rho_0[x \mapsto v_2], CallGr_x^0(G_1, G_2) | CallGr_x^+(G_1^+, G_2^+)}$$

# Finite approximation of the call semantics

**We need a “control flow graph” for ML programs**

Solution:

- drop the  $\rho$  components of the states
- abstract integers by a single symbol “?<sup>int</sup>”.

We obtain a finite abstraction of the computation.

The set of vertices of the control flow graph (i.e control points) is:

$$\mathcal{P} = \text{subexp}(\mathbb{P}) \cup \{?^{\text{int}}\}$$

# The size-change principle

What do we have:

- Termination characterized by infinite call sequences
- Well-founded order on the data values
- Finite approximation of call semantics
- We can compute two safe sets of size-change graphs describing the calls (by applying the semantic rules exhaustively).

**Hence the SCP can be applied! (twice)**

# Results

- Counter example

```
let rec counter x =  
  if x = 0 then counter (succ x) else 1  
in counter 7;;
```

is terminating but not SCT.

- Ackerman's function: SCT relatively to ground-type values.
- Function computing the minimum of two numbers:
  - is **SCT** if we use the native representation of integers provided by  $\mathcal{L}_{ml}$ ,
  - **is not SCT** if we use Church numeral to encode integers.

# Conclusion

- The Size-Change Principle from Neil D. Jones et al.
  - based on a finite approximation of the call semantics,
  - and a safe description of the calls.
- Extension to a higher-order functional language
  - detects decrease on ground-type values as well as higher-order values
  - allows local definition `let`
  - handles recursion natively (no need to define a Y combinator)
  - handles numbers natively
- Further direction  
sequential composition, storage location and references,  
tuples list, user defined structures, for and while loop  
structures.

# Bibliography



Chin Soon Lee, Neil D. Jones, and Amir Ben-Amram.  
The Size-Change Principle for Program Termination.  
*Principles of Programming Languages*, pp. 81-92. Volume 28  
of Principles of Programming Languages. ACM press 2001



Neil D. Jones and Nina Bohr  
Termination Analysis of the Untyped  $\lambda$ -Calculus.  
*Rewriting Techniques and Applications*, Proceedings (V van  
Oostrom, ed.), pp. 1-23. Volume 3091 of LNCS.  
Springer-Verlag 2004.



Andrew M. Pitts  
Operational Semantics and Program Equivalence.  
*Applied Semantics*, pp. 378-412. Volume 2395 of LNCS.  
Springer-Verlag 2002