

# Calling Context Graphs

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Formal Methods, Lecture 8

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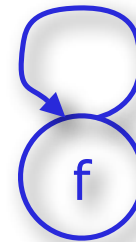
# Termination Analysis

- Quintessential undecidable software verification problem
- Calling Context Graphs and Measures
- Fully automatic termination analysis
- Domain: fully-featured, first-order, applicative functional PLs
- Combination of static analysis and theorem proving
- Implemented in ACL2s
- Experimental results: ACL2 regression suite
  - > 100MB of code (JVM, linear algebra, model checker, ...)
  - > 10,000 function definitions
  - Over a decade of submissions from worldwide user base
  - 98.7% success rate

# The Idea

- Non-termination in our domain iff  
 $\exists$  some input that leads to an infinite sequence of function calls
- Goal: Conservative, precise, analyzable abstraction
- First attempt: use call graphs
- Example:

```
define f(x) =  
  if (!intp(x) or x ≤ 1)  
    then 0  
  else if (x mod 2 = 1)  
    then f(x+1)  
    else 1 + f(x/2)
```



Not enough

# Governors

- The governors of  $e' \subseteq e$  are the branching conditions that need to be true for execution of  $e$  to lead to the execution of  $e'$
- Example

```
define f(x) =  
  if (!intp(x) or  $x \leq 1$ )  
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define  $f(x) =$

if  $(\text{!intp}(x) \text{ or } x \leq 1)$

then 0

else if  $(x \bmod 2 = 1)$

then  **$f(x+1)$**

else  $1 + f(x/2)$

- Governors for  $f(x+1)$ :  $\{\text{intp}(x), x > 1, x \bmod 2 = 1\}$

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- Governors for  $f(x+1)$ :  $\{\text{intp}(x), x > 1, x \bmod 2 = 1\}$
- Governors for  $f(x/2)$ :  $\{\text{intp}(x), x > 1, x \bmod 2 \neq 1\}$

# Precise Calling Contexts

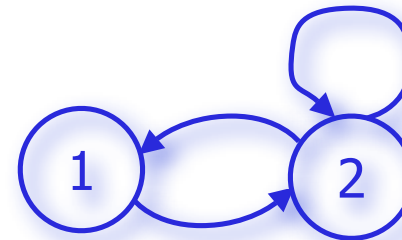
- A precise calling context for a call  $e$  is a triple containing:
  - The name of the function containing  $e$
  - The governors for  $e$  in the function body
  - The call,  $e$

■ Example: `define f(x) =`  
    `if (!intp(x) or x ≤ 1)`  
    `then 0`  
    `else if (x mod 2 = 1)`  
    `then f(x+1)`  
    `else 1 + f(x/2)`

1.  $\langle f, \{ \text{intp}(x), x > 1, x \bmod 2 = 1 \}, f(x+1) \rangle$
2.  $\langle f, \{ \text{intp}(x), x > 1, x \bmod 2 \neq 1 \}, f(x/2) \rangle$

# Calling Context Graphs

- Example: define  $f(x) =$   
    if ( $\text{!intp}(x)$  or  $x \leq 1$ )  
    then 0  
    else if ( $x \bmod 2 = 1$ )  
    then  $f(x+1)$   
    else  $1 + f(x/2)$



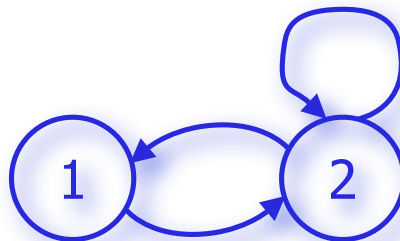
1.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 = 1\}, f(x+1) \rangle$
2.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 \neq 1\}, f(x/2) \rangle$

- Vertices are calling contexts
- An edge from  $c1$  to  $c2$  if it is possible for execution to reach  $c1$  and  $c2$  in consecutive recursive calls
- Set of all paths is an overapproximation of recursive behavior



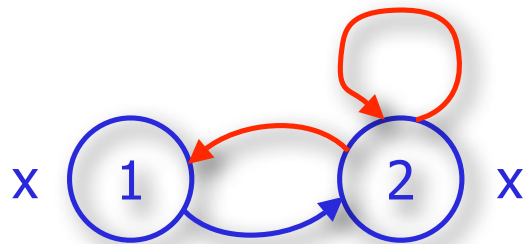
# Building Calling Context Graphs

- The edge condition:
  - ∃ values that satisfy the governors of both contexts
- Governors are arbitrary predicates
- Building a minimal CCG is undecidable
- Theorem prover queries used to eliminate unnecessary edges
- Edge included if theorem prover cannot disprove the edge condition
- We need more



# Calling Context Measures

- Map function formals into some well-founded structure
- Each calling context is given a set of CCMs
- Example:
  1.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 = 1\}, f(x+1) \rangle$
  2.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 \neq 1\}, f(x/2) \rangle$



Decreasing edge  $>$ :



Non-increasing edge  $\geq$ :

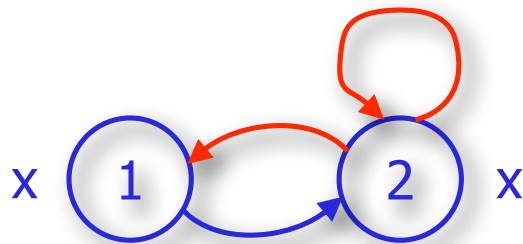


Neither  $X$ :



# The Termination Condition

- For every infinite path through the CCG,
- There should exist a corresponding sequence of CCMs,
- Such that for some tail of the sequence, each adjacent pair of CCMs is never increasing and infinitely decreasing
- Solved by Size Change back-end algorithm



Decreasing edge  $>:$



Non-increasing edge  $\geq:$

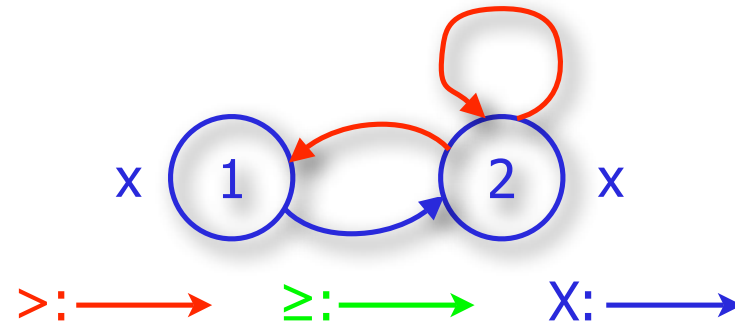


Neither X:



# Merging

```
define f(x) =  
  if (!intp(x) or x ≤ 1)  
    then 0  
  else if (x mod 2 = 1)  
    then f(x+1)  
  else 1 + f(x/2)
```

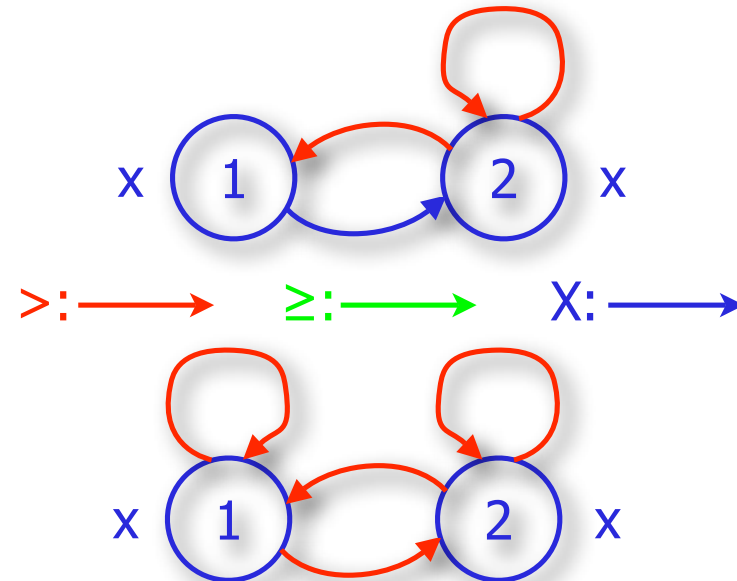


1.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 = 1\}, f(x+1) \rangle$
2.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 \neq 1\}, f(x/2) \rangle$

# Merging

```

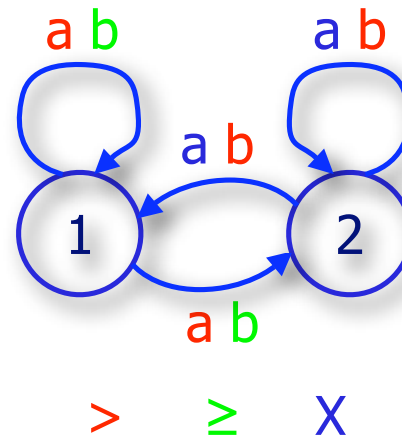
define f(x) =
  if (!intp(x) or x ≤ 1)
  then 0
  else if (x mod 2 = 1)
  then f(x+1)
  else 1 + f(x/2)
  
```



1.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 = 1, \text{intp}(x+1), x+1 > 1, (x+1) \bmod 2 \neq 1\}, f((x+1)/2) \rangle$
2.  $\langle f, \{\text{intp}(x), x > 1, x \bmod 2 \neq 1\}, f(x/2) \rangle$

# Ackermann's Function

```
define ack (a, b) =  
  if (!intp(a) or a ≤ 0)  
    then 1  
  else if (!intp(b) or b ≤ 0)  
    then if a=1  
          then 2  
          else a+2  
    else ack(ack(a-1, b), b-1)
```



1.  $\langle \text{ack}, \{\text{intp}(a), 0 < a, \text{intp}(b), 0 < b\}, \text{ack}(a-1, b) \rangle$
2.  $\langle \text{ack}, \{\text{intp}(a), 0 < a, \text{intp}(b), 0 < b\}, \text{ack}(\text{ack}(a-1, b), b-1) \rangle$

# Full Algorithm

- We presented a simplified version of our analysis
- Mutual Recursion
- SCC analysis: can have more SCCs than functions
- Hierarchical Analysis
- Merging on a per-node basis: different edges correspond to different numbers of steps
- Multiple CCMs
- CCMs that combine formals (e.g.,  $x - y$ )
- Different CCMs for different nodes
  - Saturation algorithm for propagating CCMs

# JVM Example

```
(mutual-recursion
;; mma2 :: num, counts, s, ac --> [refs]
(defun mma2 (c1 c2 s ac)
  (declare (xargs :measure (cons (len (cons c1 c2))
                                (natural-sum (cons c1 c2))))))
  (if (zp c1)
      (mv (heap s) ac)
      (mv-let (new-addr new-heap)
              (mma c2 s)
              (mma2 (- c1 1)
                    c2
                    (make-state (thread-table s)
                               new-heap
                               (class-table s))
                    (cons (list 'REF new-addr) ac))))))

;; mma :: [counts], s --> addr, new-heap
(defun mma (counts s)
  (declare (xargs :measure (cons (+ 1 (len counts))
                                (natural-sum counts))))
  (if (<= (len counts) 1)

      ;; "Base case" Handles initializing the final dimension
      (mv (len (heap s))
          (bind (len (heap s))
                (makearray 'T_REF
                           (car counts)
                           (init-array 'T_REF (car counts))
                           (class-table s))
                (heap s)))

      ;; "Recursive Case"
      (mv-let (heap-prime lst-of-refs)
              (mma2 (car counts)
                   (cdr counts)
                   s
                   nil)
              (let* ((obj (makearray 'T_REF
                                    (car counts)
                                    lst-of-refs
                                    (class-table s)))
                    (new-addr (len heap-prime))
                    (new-heap (bind new-addr obj heap-prime)))
                (mv new-addr new-heap))))))
)
```



# JVM Example

```
(mutual-recursion
  (defun mma2 (c1 c2 s ac)
    (if (zp c1)
        ...
        (mv-let (new-addr new-heap)
                (mma c2 s)
                (mma2 (- c1 1) c2 e e')))))
```

```
(defun mma (c s)
  (if (<= (len c) 1)
      ...
      (mma2 (car c) (cdr c) s nil)
      ...)))
```

```
mma2 measure: (cons (len (cons c1 c2))
                    (natural-sum (cons c1 c2)))
mma measure: (cons (+ 1 (len c)) (natural-sum c))
```

# Experimental Results

- Implemented in ACL2s
- Ran our algorithm over the ACL2 Regression Suite
  - Over 100MB, 11,000 function definitions
- Ignored all user hints and other explicit assistance
- Over 98% success rate

Experiment: No Theorems

Problems	Total	CCG	ACL2
<b>Non-Trivial</b>	<b>1762</b>	<b>1408 (80%)</b>	<b>1056 (60%)</b>
Recursive	4348	3394 (92%)	3642(84%)

Experiment: Theorems

<b>Non-Trivial</b>	<b>1762</b>	<b>1544 (87%)</b>	<b>1056 (67%)</b>
Recursive	4348	3394 (95%)	3642(87%)