



Bounded Model Checking Higher-Order Programs

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Verifying Software: Model Checking

Given a **program** M :

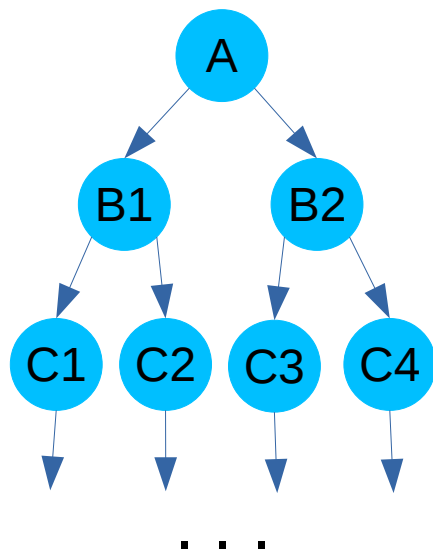
For **model** ϕ of M and a **property** α prove $\phi \models \alpha$

- α safety defined by assertions
- ϕ is exhaustively explored
- State-space explosion limits feasibility

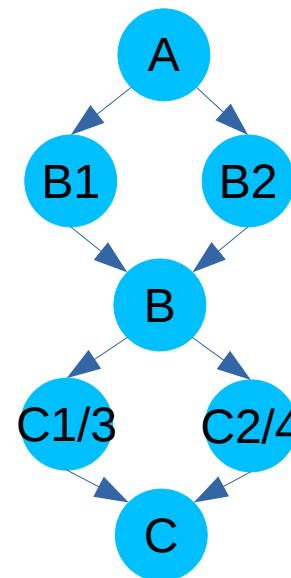
Bounded Model Checking

- Industrially successful on C-like languages
- Exchanges completeness for feasibility
- **BMC:** Bounded unwindings of a system
 - Symbolic values (free variables) instead of concrete
 - Performs state-merging after branching

Unbounded computation paths



Bounded model with state-merging



The CBMC Approach

Reduces verification problem to SAT:

1) Unwind loops k times

Loop:

`while(B) A ;`

Loop unwound to k=3:

```
if(B) { A;  
  if(B) { A;  
    if(B) { A; }  
  }  
}
```

2) Convert program to **Static-Single Assignment (SSA)** form

Normal Assignment:

`x=x+1;`

`x=x+2;`

`y=x+3;`

`y=y+x;`

Static-Single Assignment:

`x1=x0+1;`

`x2=x1+2;`

`y1=x2+3;`

`y2=y1+x2;`

3) Produce program constraints ϕ and assertions α

The CBMC Procedure

```
if (x > z) {  
  y := x;  
} else {  
  y := z+1;  
}  
w := 2*y;  
  
assert(w > 2*z);
```

```
if (x0 > z0) {  
  y1 := x0;  
} else {  
  y2 := z0+1;  
}  
y3 := (x0 > z0)? y1 : y2;  
w1 := 2*y3;  
  
assert(w1 > 2*z0);
```

$$\begin{aligned}\phi &:= (y_1 = x_0) \wedge \\ &\quad (y_2 = z_0 + 1) \wedge \\ &\quad (y_3 := (x_0 > z_0)?y_1 : y_2) \wedge \\ &\quad (w_1 := 2 * y_3) \\ \alpha &:= (w_1 > 2 * z_0)\end{aligned}$$

To prove $\phi \implies \alpha$ we show that $\phi \wedge \neg\alpha$ is not SAT
i.e. if $\exists A.A \models \phi \wedge \neg\alpha$ then A is a counterexample

Higher-Order Programs

We examine a **higher-order** language with **references**

- higher-order methods
- higher-order lambda abstractions
- higher-order (global) store

$$\begin{aligned} M ::= & \text{assert}(M) \mid x \mid m \mid i \mid () \mid r := M \mid !r \\ & \mid \lambda x.M \mid MM \mid M \oplus M \mid \langle M, M \rangle \mid \pi_1 M \mid \pi_2 M \\ & \mid \text{if } M \text{ then } M \text{ else } M \mid \text{let } x = M \text{ in } M \\ & \mid \text{letrec } x = \lambda x.M \text{ in } M \mid \langle M \rangle \end{aligned}$$
$$\begin{array}{c} \frac{M : \text{int}}{\text{assert}(M) : \text{unit}} \quad \frac{}{() : \text{unit}} \quad \frac{}{i : \text{int}} \quad \frac{x \in \text{Vars}_\theta}{x : \theta} \quad \frac{m \in \text{Meths}_{\theta, \theta'}}{m : \theta \rightarrow \theta'} \\[10pt] \frac{M : \text{int} \quad M_0, M_1 : \theta}{\text{if } M \text{ then } M_1 \text{ else } M_0 : \theta} \quad \frac{r \in \text{Refs}_\theta}{!r : \theta} \quad \frac{r \in \text{Refs}_\theta \quad M : \theta}{r := M : \text{unit}} \quad \frac{M' : \theta \rightarrow \theta' \quad M : \theta}{M' M : \theta'} \end{array}$$

Operational Semantics

Configurations of the form (M, R, S, k) ←

M: term to evaluate
R: method repository
S: store
k: call counter

- **Counter** k for nested method application

Example transition rules:

$$(E[\text{assert } (i)], R, S, k) \rightarrow (E[()], R, S, k)$$

$$(E[!r], R, S, k) \rightarrow (E[S(r)], R, S, k)$$

$$(E[\text{if } 0 \text{ then } M_1 \text{ else } M_0], R, S, k) \rightarrow (E[M_0], R, S, k)$$

$$(E[\text{if } i \text{ then } M_1 \text{ else } M_0], R, S, k) \rightarrow (E[M_1], R, S, k) \quad (i \neq 0)$$

$$(E[mv], R, S, k) \rightarrow (E[(\lambda M)], R, S, k + 1) \text{ where } R(m) = \lambda x. M$$

$$(E[(\lambda v)], R, S, k) \rightarrow (E[v], R, S, k - 1)$$

$$E ::= \bullet \mid \text{assert}(E) \mid r := E \mid E \oplus M \mid v \oplus E \mid \langle E, M \rangle \mid \langle v, E \rangle \mid \pi_j E \mid mE \\ \mid \text{let } x = E \text{ in } M \mid \text{if } E \text{ then } M \text{ else } M \mid (E)$$

Nominal Defunctionalization

- **Repository** $R : \text{Meths} \rightarrow \text{Terms}$ of all method names created so far
- Higher-order methods become first-order values
- Allows reasoning about control-flow of methods passed
- Replace all arrow-type terms with **names** m

$$(\lambda x.M, R, S, k) \rightarrow (m, R[m \mapsto \lambda x.M], S, k)$$

$$(\text{letrec } f = \lambda x.M \text{ in } M', R, S, k) \rightarrow (M'\{m/f\}, R[m \mapsto \lambda x.M\{m/f\}], S, k)$$

Our Approach

Bounded symbolic-state syntactical translation based on:

- *defunctionalization* using nominal techniques
- adaptation of *SSA* to higher-order values
- *points-to analysis* to deal with symbolic methods

Bound: nested method application

Returns: ground-type counterexamples

The translation:

$$\llbracket M, R, S \rrbracket_{k_0} = (\phi, \alpha, pc)$$

M, R, S as before. We add program constraints ϕ , assertions α , path condition pc , and a call bound k_0

Symbolic Method Application

```
r := if (n <= 0) then (λ x. x-1) else (λ x. x+1);  
assert(!r n >= n)
```

```
let ret = if n then m1 else m2  
r := ret  
assert(!r n >= n)
```

```
let ret' = m1 n in  
assert(ret' >= n)
```

```
let ret' = m2 n in  
assert(ret' >= n)
```

which name to use when dereferencing *r*?

Points-to Analysis avoids combinatorial blow-up in names

$$(ret' < n) \wedge (r = m1 \Rightarrow ret' = n - 1) \wedge (r = m2 \Rightarrow ret' = n + 1) \wedge (r = ret) \\ \wedge (n \leq 0 \Rightarrow ret = m1) \wedge (n > 0 \Rightarrow ret = m2)$$

(SAT with n=0)

Our BMC Procedure

- Keep track of bound with flag variable `inil`
- When bound is breached, add assertion $(pc \implies \text{inil})$

BMC Procedure:

- 1) $\llbracket M, R, S \rrbracket_{k_0} = (\phi, \alpha, pc)$
- 2) Check for assertion violation: $\phi \wedge \text{inil} \wedge \neg \alpha$
if **SAT**, error found. Otherwise:
- 3) Check for breached bound: $\phi \wedge \neg \text{inil} \wedge \neg \alpha$
if **UNSAT**, program is fully verified.
Otherwise, increase bound and repeat

Soundness and Correctness

- Soundness (no false positives):
 - $\phi \wedge \mathbf{inil} \wedge \neg\alpha$ is SAT iff an assertion violation is reachable

Otherwise:

- $\phi \wedge \neg\mathbf{inil} \wedge \neg\alpha$ is SAT iff the bound is reachable

- Correctness:

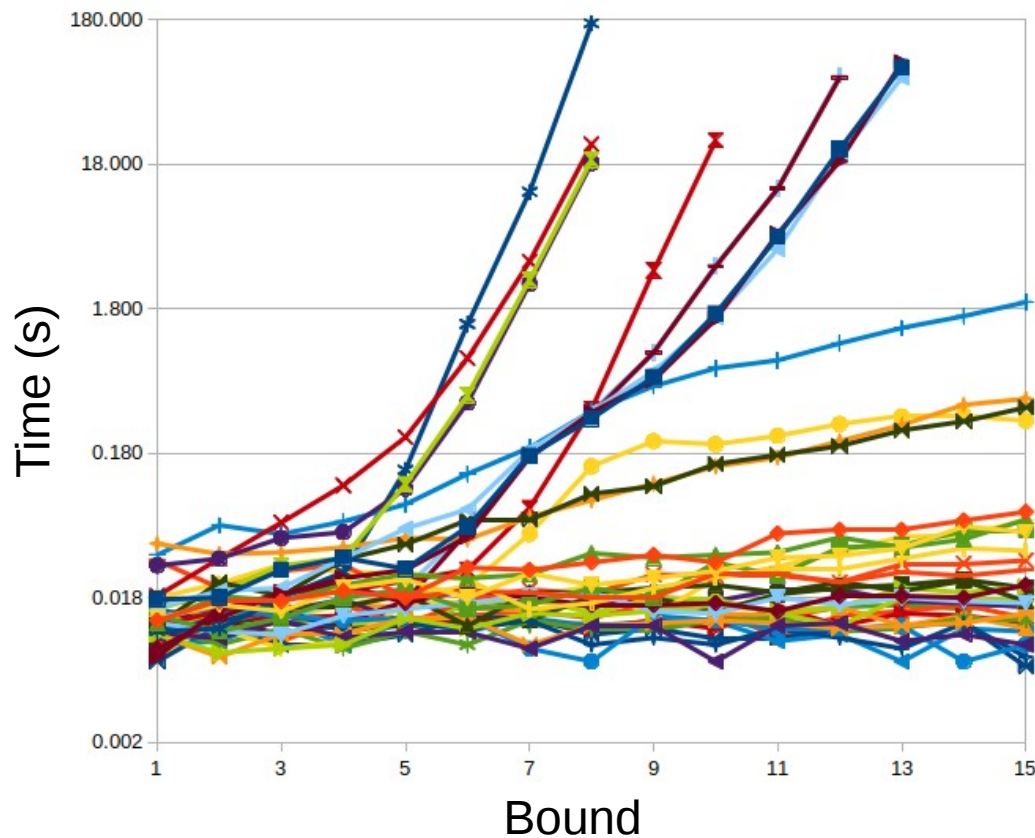
The translation captures the operational semantics

$$(M, R, S, k) \rightarrow (\chi, R', S', k') \implies \exists \sigma \models \phi \wedge (ret = \chi)$$

Implementation: BMC-2

Tests on 40 programs, including ones from MoCHi benchmark

MoCHi (<50 LoC) + larger programs (100 to 400 LoC)



<https://github.com/LaifsV1/BMC-2>

Comparison: MoChi

Kobayashi, Sato, and Unno. PLDI 2011

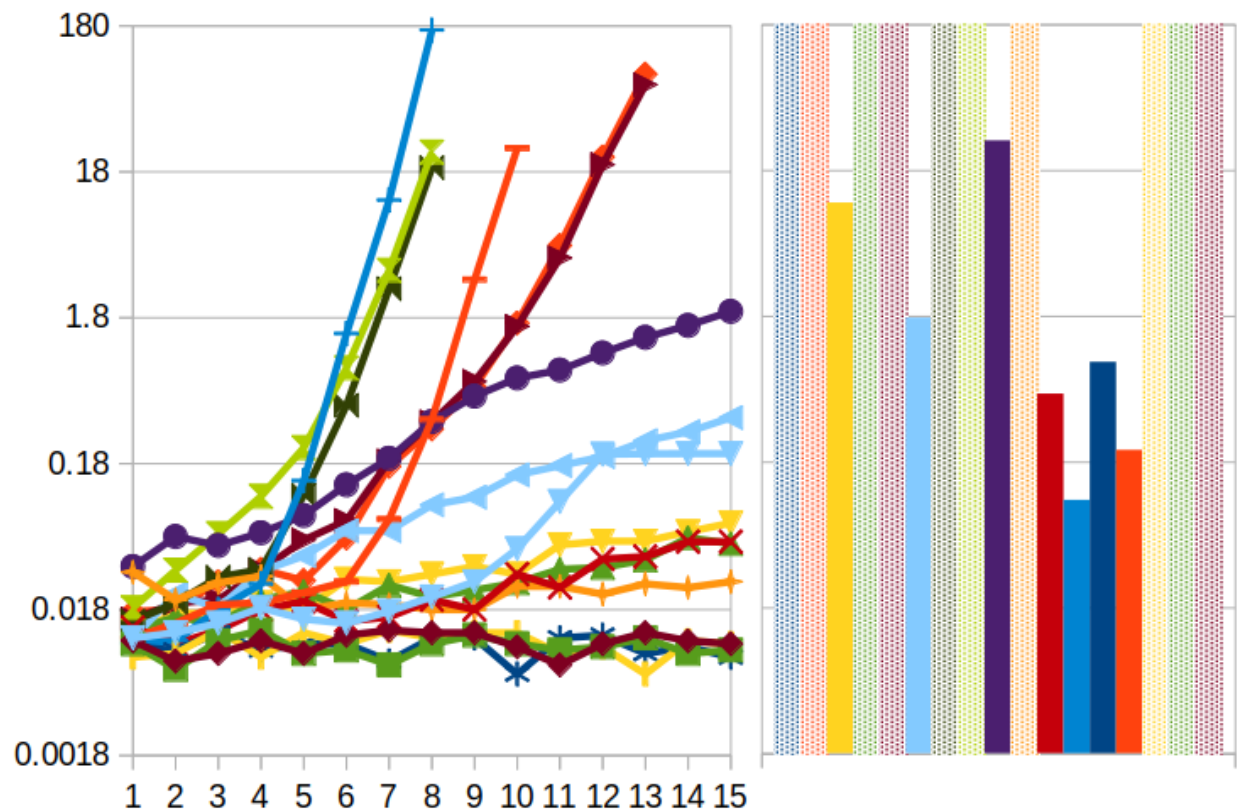
- Model Checking tool for HO Programs via CEGAR and HORS

MoChi:

- Able to prove full correctness

BMC-2:

- Less affected by program size
- Less affected by specific program features
- Supports general references
- Found all errors soundly
- Inconclusive if no errors found



Time (s) vs Bound for **BMC-2**

Time (s) for **MoChi**

Dotted Area: Timeout or Crash

Comparison: Rosette

Torlak and Bodik. PLDI 2014

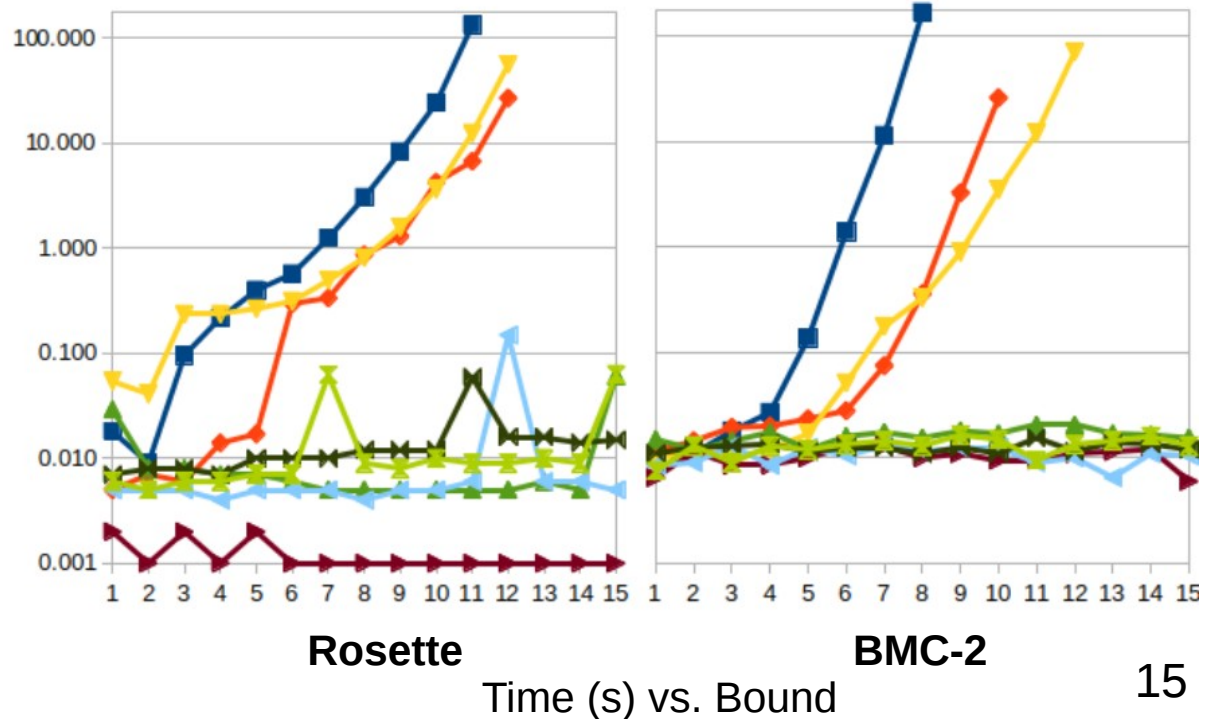
- Solver-aided language for Racket
- Built-in efficient Symbolic Execution (SE) with type-driven state merging
- We implemented our bounding semantics in Rosette to compare BSE to BMC

Rosette:

- Better optimised for diverging paths

BMC-2:

- Alternative to SE-based tools
- Faster for low bounds
- Faster compilation than SE
- Similar behaviour, but BMC-2 is not optimised
 - Inefficient state merging
 - No concretisation



Demo: Bug-Finding

Consider program **mc91-e** from the MoCHi benchmark:

```
let rec mc91 x =  
  if x > 100 then  
    x - 10  
  else  
    mc91 (mc91 (x + 11))  
let main n = assert (mc91 n = 91)
```

It is supposed to always return 91, but does it?

Demo: Total Correctness

Consider the following program:

```
let r = ref 0
let f x = (r := (x-1)); !r
let g x = (r := (x+1)); !r
let main n = r:=n; assert (f(g n) == n)
```

The program has a finite-depth computation tree. Can it be totally verified?



Conclusions and Future Work

- Alternative to Bounded Symbolic Execution for HO programs
- BMC has theoretical advantages to SE (compilation, memory)
- Results are preliminary: technology is not fully optimised
- Approach could be implemented into existing tools like CBMC