

Modular Inference for Array Checks Optimization

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Joint work with

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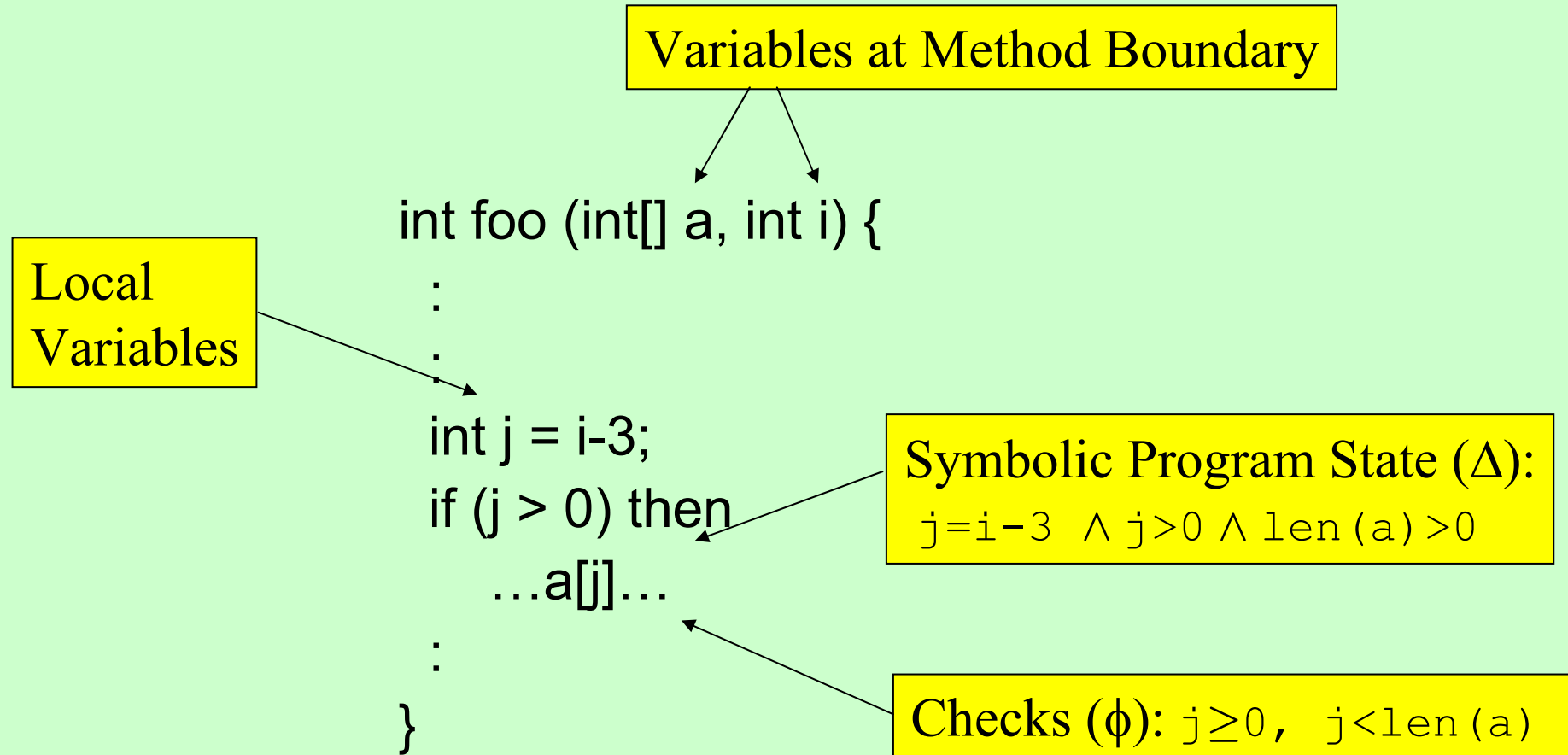
Array Bound Check Elimination

- Problem:
 - without array bound checks (e.g. C), programs may be unsafe.
 - with array bound checks (e.g. Java), programs are slowed down.
- Solution: remove redundant checks.

Current status

- Data flow analysis
 - Intra-procedural analysis
[Kolte,Wolfe:*PLDI*'95;
Bodik,Gupta,Sarkar:*PLDI*'00]
- Verification-Based Methods
 - Type Checking [Xi,Pfenning:*PLDI*'98]

Main Ideas



Totally-safe Check

ϕ is *totally-safe* if $\Delta \Rightarrow \phi$

```
int foo (int[] a, int i) {  
  :  
  :  
  int j = i-3;  
  if (j > 0) then  
    ...a[j]...  
  :  
}
```

$\phi_L = j \geq 0$

$\Delta = (j=i-3 \wedge j>0 \wedge \text{len}(a)>0)$

ϕ_L is **totally-safe**

Partially-safe Check

```
int foo (int[] a, int i) {  
  :  
  :  
  int j = i-3;  
  if (j > 0) then  
    ...a[j]...  
  :  
}
```

$\phi_H = j < \text{len}(a)$

$\Delta = (j = i - 3 \wedge j > 0 \wedge \text{len}(a) > 0)$

ϕ is not totally-safe because $\Delta \Rightarrow \phi$ is not a tautology

Partially-safe Check

```
int foo (int[] a, int i) {  
  :  
  :  
  int j = i-3;  
  if (j > 0) then  
    ...a[j]...  
  :  
}
```

$\phi_H = j < \text{len}(a)$

$\Delta = (j = i - 3 \wedge j > 0 \wedge \text{len}(a) > 0)$

But ϕ may be made safe when foo is called with a suitable state ψ :
 $\exists \psi. \psi \wedge \Delta \Rightarrow \phi$
We call ϕ a **partially-safe check**.

Partially-safe Check

```

int foo (int[] a, int i) {
  :
  :
  int j = i-3;
  if (j > 0) then
    ...a[j]...
    :
  }

```

$$\phi_H = j < \text{len}(a)$$

$$\Delta = (j = i - 3 \wedge j > 0 \wedge \text{len}(a) > 0)$$

$$\text{pre}_H(V) = i < \text{len}(a) + 3$$

Goal: Find the weakest **pre** such that: **pre** $\wedge$ $\Delta \Rightarrow \phi$

$$\text{pre}(V) = \forall (L) . \neg \Delta \vee \phi$$

Unsafe Check

```
int foo (int[] a, int i) {  
  :  
  :  
  int j = random();  
  if (j > 0) then  
    ...a[j]...  
    :  
    :  
  }
```

$\phi_H = j < \text{len}(a)$

$\Delta = (j > 0 \wedge \text{len}(a) > 0)$

$\text{pre}_H(V) = \text{false}$

There is no call context that can make ϕ totally-safe.
We call ϕ an **unsafe check**

3-way Check Classification

- Totally-safe
 - Run-time check is redundant, and can be eliminated.
- Partially-safe
 - Weakest precondition derivation is required.
- Unsafe
 - Run-time check is required.

Talk overview



- IMP – core language.
- Modular inference.
- Specialization.
- Experimental results.

IMP source language

- Input program:

$\mathbf{P} ::= \text{meth}^* \text{prim}^*$

$\mathbf{meth} ::= t \ m \ (t_1 \ v_1, \dots t_n \ v_n) \ \{ e \}$

$\mathbf{e} ::= c \mid v \mid v = e \mid t \ v = e_1; e_2$
 $\mid \text{if } v \text{ then } e_1 \text{ else } e_2 \mid m(v_1, \dots v_n)$

- Base and array types:

$\tau ::= \text{Void} \mid \text{Int} \mid \text{Bool} \mid \text{Float}$

$t ::= \tau \mid \tau[\text{Int}, \dots, \text{Int}]$

Sized Type

- Sized type associates size information to values in a type
- Types carry *size* annotations:
 - Int^n
 - Size of integer value k : $n = k$
 - Bool^b
 - Size of value True : $b = 1$; False : $b = 0$
 - Void , Float
 - $\text{Int}[\text{Int}^a]$
 - Size of array $[1,1,1,1]$: $a = 4$

Size Constraints

Δ, ϕ – Presburger constraints

$\Delta, \phi ::= \beta \mid \phi \wedge \phi \mid \phi \vee \phi \mid \neg \phi \mid \exists n \cdot \phi \mid \forall n \cdot \phi$

$\beta ::= \text{True} \mid \text{False} \mid \alpha = \alpha \mid \alpha \leq \alpha$

$\alpha ::= c \mid n \mid c * \alpha \mid \alpha + \alpha \mid - \alpha$

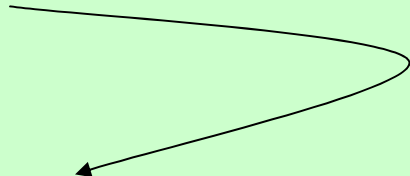
c – integer constant

n – size variable

Array Primitive Operations

$\text{prim} ::= t \text{ m } (t_1 \ v_1, \dots t_n \ v_n) \text{ where } \Delta, \Phi$

Postcondition, Preconditions



$\text{float}[n] \ a = v$

$a[i] = v$

$a[i]$

$\text{len}(a)$

$\text{Float}[\text{Int}^a] \ \mathbf{newArray} \ (\text{Int}^n \ n, \text{Float} \ v)$

where $(a=n), \{S: n>0\}$

$\text{Void} \ \mathbf{assign} \ (\text{Float}[\text{Int}^a] \ a, \text{Int}^i \ i, \text{Float} \ v)$

where $(0 \leq i < a), \{L: 0 \leq i, H: i < a\}$

$\text{Float} \ \mathbf{sub} \ (\text{Float}[\text{Int}^a] \ a, \text{Int}^i \ i)$

where $(0 \leq i < a), \{L: 0 \leq i, H: i < a\}$

$\text{Int}^r \ \mathbf{len} \ (\text{Float}[\text{Int}^a] \ a) \text{ where } (a=r), \{ \}$

Modular Inference

- Compute for each method:
 - Preconditions
 - Derive minimal call context
 - Postcondition
 - Derive program states

Precondition Derivation

Int^r foo (Int[Int^a] a, Int^v v, Bool^b b) {

Int^j j = v+1;

if b then

a[j]

else v

}

{ pre_L, pre_H }

$\phi_L = 0 \leq j$
$\phi_H = j < a$

$\Delta_1 = (j=v+1 \wedge b=1)$

$\Delta_1 \Rightarrow \phi_L$? $\text{pre}_L \wedge \Delta_1 \Rightarrow \phi_L$

$\text{pre}_L = \forall \text{Local}. (\neg \Delta_1 \vee \phi_L)$

$\text{pre}_L = (b=0 \vee 0 \leq v+1)$

Postcondition

Int^r foo (Int[Int^a] a, Int^v v, Bool^b b) {

Int^j j = v+1;

if b then

a[j]

else v

}

$\Delta, \{ \text{pre}_L, \text{pre}_H \}$

$\phi_L = 0 \leq j$

$\phi_H = j < a$

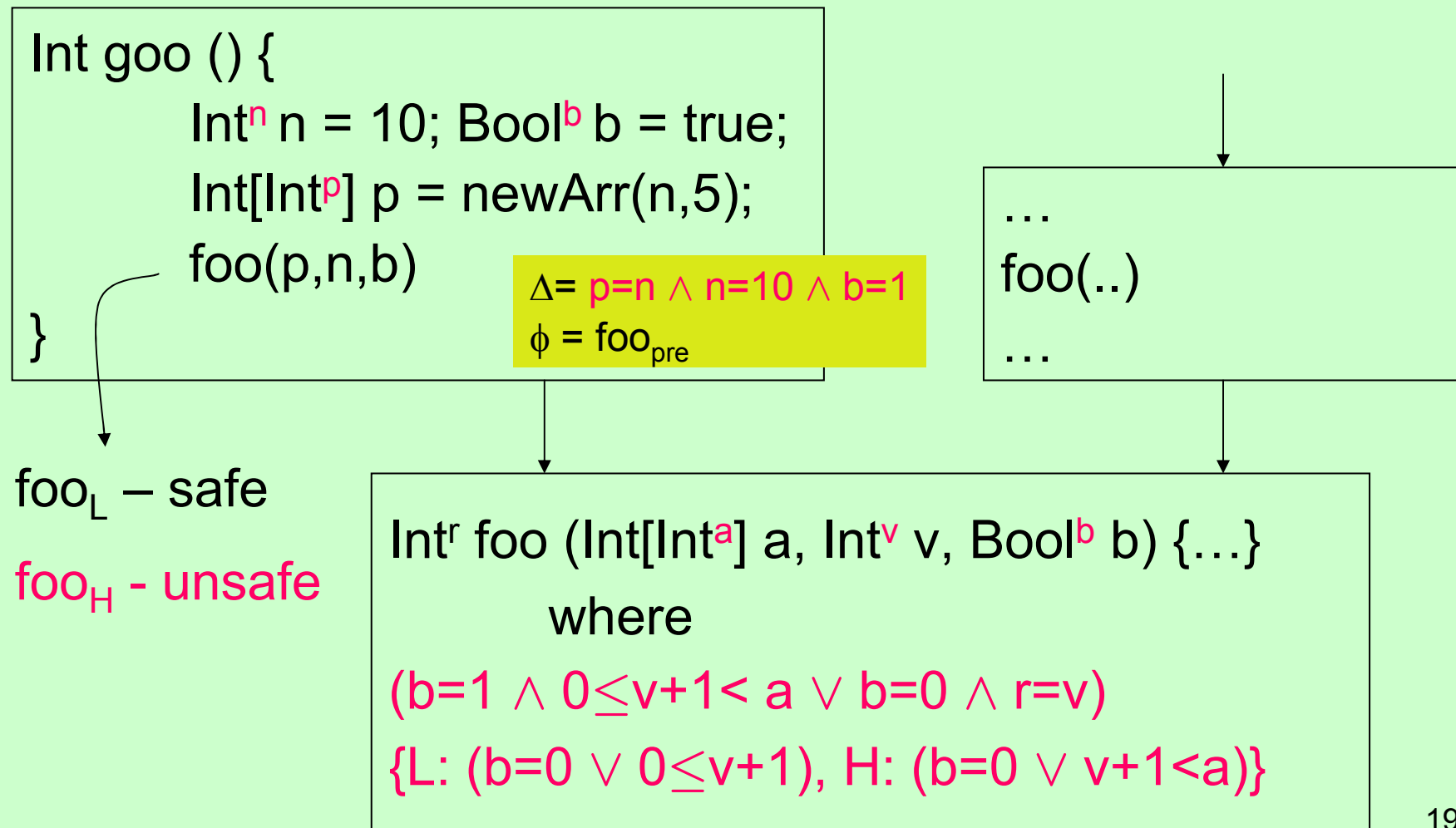
$\Delta_1 = (j=v+1 \wedge b=1)$

$\Delta_2 = (j=v+1 \wedge (b=1 \wedge 0 \leq j < a \vee b=0 \wedge r=v))$

$\Delta = \exists \text{Local. } \Delta_2$

$\Delta = (b=1 \wedge 0 \leq v+1 < a \vee b=0 \wedge r=v)$

Precondition Propagation



Recursive Methods

- Method body is abstracted to a recursive constraint.
- Two kinds of fixpoint computations:
 - postcondition.
 - recursive invariant.
 - represents the change of input arguments at nested recursive calls.
- The recursive invariant is used to determine safety of checks inside recursion.

Recursive Example

Float sumvec(Float[Int^s] a, Intⁱ i, Int^j j) where Δ
{ if $i > j$ then 0.0 else {
 Int v = a[i];
 v + sumvec(a, i+1, j) }
}

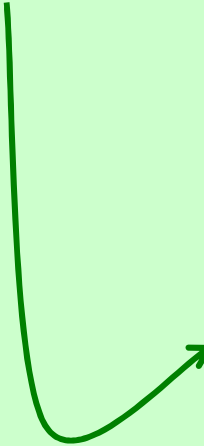
$INV \wedge \Delta_1 \Rightarrow \phi$

$\text{sumvec}\langle s, i, j \rangle = (i > j) \vee$
 $(i \leq j \wedge 0 \leq i < s \wedge i1 = i+1 \wedge \text{sumvec}\langle s, i1, j \rangle)$

Recursive Example

```
Float sumvec(Float[Ints] a, Inti i, Intj j)
{ if i>j then 0.0 else {
  Int v = a[i];
  v+sumvec(a,i+1,j) }
}
```

$$\Delta = (i > j \vee 0 \leq i \leq j \wedge i < s)$$

$$\{\phi_L: (j < i \vee 0 \leq i), \phi_H: (j < s \vee \dots)\}$$


$$\text{sumvec}\langle s, i, j \rangle = (i > j) \vee$$

$$(i \leq j \wedge 0 \leq i < s \wedge i1 = i + 1 \wedge \text{sumvec}\langle s, i1, j \rangle)$$

Recursive Example (ii)

- Bottom-up fixpoint

- start with base case:

- $$\text{sumvec}_0\langle s, i, j \rangle = (i > j) \vee \text{false}$$

- iterate over:

- $$\text{sumvec}_{i+1}\langle s, i, j \rangle = (i > j) \vee$$
$$(i \leq j \wedge 0 \leq i < s \wedge i1 = i + 1 \wedge \text{sumvec}_i\langle s, i1, j \rangle)$$

- reach fixpoint:

- $$\text{sumvec}_4 = (i > j) \vee (0 \leq i \leq j, s-1)$$

Recursive Example (iii)

$$\text{sumvec}\langle s, i, j \rangle = (i > j) \vee (i \leq j \wedge 0 \leq i < s \wedge i1 = i + 1 \wedge \text{sumvec}\langle s, i1, j \rangle)$$

- Top-down fixpoint

- start with one-step relation:

$$I_1\langle s, i, j, s', i', j' \rangle = (i \leq j \wedge 0 \leq i < s \wedge s' = s \wedge i' = i + 1 \wedge j' = j \wedge \text{true})$$

- iterate over:

$$I_{i+1}\langle s, i, j, s', i', j' \rangle = I_i\langle s, i, j, s', i', j' \rangle \vee (\exists s1, i1, j1 \cdot I_i\langle s, i, j, s1, i1, j1 \rangle \wedge I_1\langle s1, i1, j1, s', i', j' \rangle)$$

- reach fixpoint:

$$\text{sumvec}I_4\langle s, i, j, s', i', j' \rangle = (s' = s \wedge j' = j \wedge 0 \leq i < i' \leq s, j + 1)$$

Type Judgment

$$\Gamma; \Delta \vdash e :: t, \Delta_1, \Phi, \Upsilon$$

Γ – type-mapping between program variables (e) and size variables (Δ)

Δ (Δ_1) – pre (post-) state for e .

Φ – partially-safe preconditions to be classified at the caller site.

Υ – unsatisfiable checks.

Summary – Type System

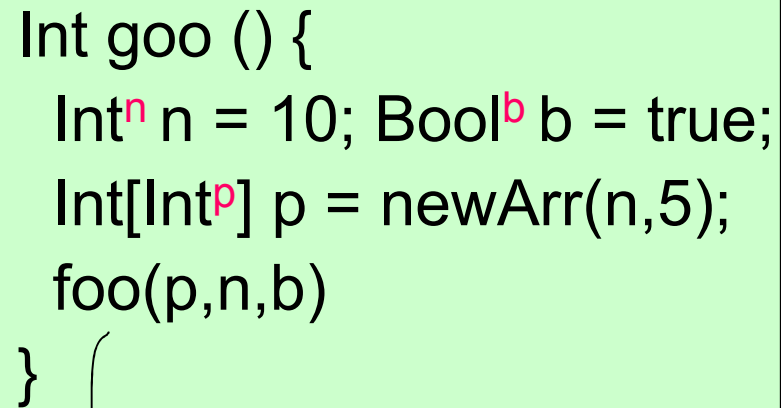
- Able to capture imperative updates
- Flow, path, context sensitive $\rightarrow$ *precision*
- Allow partially-safe checks and compute corresponding preconditions

$$\text{pre} = \forall L. (\neg \Delta \vee \phi)$$

How to Handle Unsafe Checks

Unsafe Checks

```
Int goo () {  
  Intn n = 10; Boolb b = true;  
  Int[Intp] p = newArr(n,5);  
  foo(p,n,b)  
}
```



foo_H – unsafe

```
Intr foo (Int[Inta] a, Intv v, Boolb b) {...}  
  where
```

$(b=1 \wedge 0 \leq v+1 < a \vee b=0 \wedge r=v)$

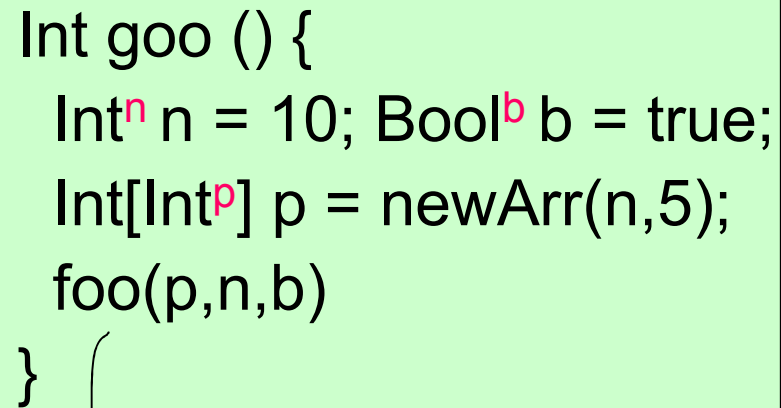
$\{L: (b=0 \vee 0 \leq v+1), H: (b=0 \vee v+1 < a)\}$

Possible reason?

- imprecise analysis
- real bug

Unsafe Checks

```
Int goo () {  
  Intn n = 10; Boolb b = true;  
  Int[Intp] p = newArr(n,5);  
  foo(p,n,b)  
}
```



foo_H – unsafe

Solution 1: give type-error

Solution 2: insert run-time check

```
Intr foo (Int[Inta] a, Intv v, Boolb b) {...}  
  where
```

$(b=1 \wedge 0 \leq v+1 < a \vee b=0 \wedge r=v)$

$\{L: (b=0 \vee 0 \leq v+1), H: (b=0 \vee v+1 < a)\}$

Unsafe Checks

```
Int goo () {  
  Intn n = 10; Boolb b = true;  
  Int[Intp] p = newArr(n,5);  
  if (..) foo(p,n,b) else error  
}
```



foo_H – unsafe

```
Intr foo (Int[Inta] a, Intv v, Boolb b) {...}  
  where
```

$(b=1 \wedge 0 \leq v+1 < a \vee b=0 \wedge r=v)$

$\{L: (b=0 \vee 0 \leq v+1), H: (b=0 \vee v+1 < a)\}$

Solution 2a: specialize caller

- check motion
- what guard test?
- see: Output Constraint Specialization

(Khoo, Shi – AsiaPEPM'02)

Unsafe Checks

```
Int goo () {  
  Int n = 10; Bool b = true;  
  Int[Int] A = newArr(n,5);  
  foo(A,n,b)  
}
```

foo_H – unsafe

Solution 2b: specialize callee

- guard the primitive operation.

```
Intr foo(Int[Inta] a, Intv v, Boolb b)  
{..  
  if (j<len(a)) then sub(a,j) else error  
  .. }
```

Specialization

- Monovariant specializer
 - Single optimized code for each method.
 - Uses the lower bound of all optimization.
 - Trades optimization for code space.
- Polyvariant specializer
 - Multiple optimized code for each method.
 - Each call site is replaced by its suitably optimized code.

Example

```

Int goo () {
  Int n = 10; Bool b = true;
  Int[Int] p = newArr(n,5);
  Int i =  $\ell_2$ : foo(p,n,b);
   $\ell_3$ : foo(p,i,b)
}

```

```

Int foo(Int[Int] a, Int v, Bool b) {
  Int j = v+1;
  if b then
     $\ell_1$ : a[j]
  else v
}

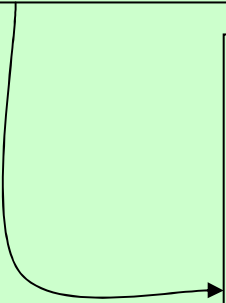
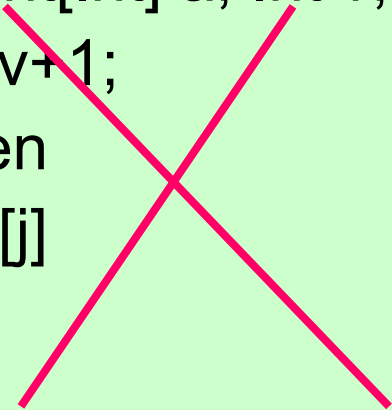
```

Pre-Conditions of <code>foo</code> computed			
$\ell_1.L$	$\ell_1.H$		
partially safe	partially safe		
Pre-Conditions of <code>goo</code> computed			
$\ell_2.\ell_1.L$	$\ell_2.\ell_1.H$	$\ell_3.\ell_1.L$	$\ell_3.\ell_1.H$
safe	unsafe	unsafe	unsafe

Monovariant Specialization

```
Int goo () {  
  Int n = 10; Bool b = true;  
  Int[Int] p = newArr(n,5);  
  Int i = foo1(p,n,b);  
  foo1(p,i,b)  
}
```

```
Int foo(Int[Int] a, Int v, Bool b) {  
  Int j = v+1;  
  if b then  
    a[j]  
  else v  
}
```



```
Int foo1(Int[Int] a, Int v, Bool b)  
{..  
  if b then  
    if (0 ≤ j) then  
      if (j < len(a)) then sub(a,j) else error  
    else error  
  else v }
```

Polyvariant Specialization

```
Int goo () {  
  Int n = 10; Bool b = true;  
  Int[Int] p = newArr(n,5);  
  Int i = foo1(p,n,b);  
  foo2(p,i,b)  
}
```

```
Int foo1(Int[Int] a, Int v, Bool b) {  
  {.. if b then  
    if (j < len(a)) then a[j]  
    else error  
  else v }  
}
```

```
Int foo2(Int[Int] a, Int v, Bool b)  
{.. if b then  
  if (0 ≤ j) then  
    if (j < len(a)) then a[j] else error  
  else error  
else v }
```

Soundness

- Inference + specialization =
Well-typed program

If a method is *well-typed*, the execution of its body never incurs *invalid array-accesses*.

Experiments

- Prototype built using:
 - Haskell (GHC)
 - Omega constraint solving library (*Pugh et al*)
 - interface C-Haskell
- Test programs:
 - Complex recursion
 - Scientific benchmarks
- The method is viable
 - Sufficiently precise to eliminate checks.
 - Sufficiently fast to be usable.

Experimental Results

Benchmark Programs	Source (lines)	Static Checks	Checking (secs)	Inference (secs)	Dynamic Checks Eliminated
binary search	50	2	0.17	1.81	100%
bubble sort	59	12	0.43	1.51	100%
hanoi tower	38	16	3.73	11.47	100%
merge sort	80	16	7.70	13.07	100%
queen	45	8	0.52	2.10	100%
quick sort	67	12	0.38	1.76	100%
sentinel	26	4	0.05	0.16	50%
sparse multiply	46	12	3.27	7.09	100%
sumvec	33	2	0.11	0.47	100%
FFT	336	62	9.58	28.74	100%
LU Decomp.	191	80	13.10	72.91	100%
SOR	84	24	1.15	3.8	100%
Linpack	903	166	42.26	162.2	100%

Conclusion

- Imperative sized type inference
- Modular analysis:
 - 3-way check classification
 - precondition propagation
 - specialization to insert runtime tests
- Implementation
 - Web interface

<http://loris-4.ddns.comp.nus.edu.sg/~popeeaco>