

Selective Context-Sensitivity Guided by Impact Pre-Analysis

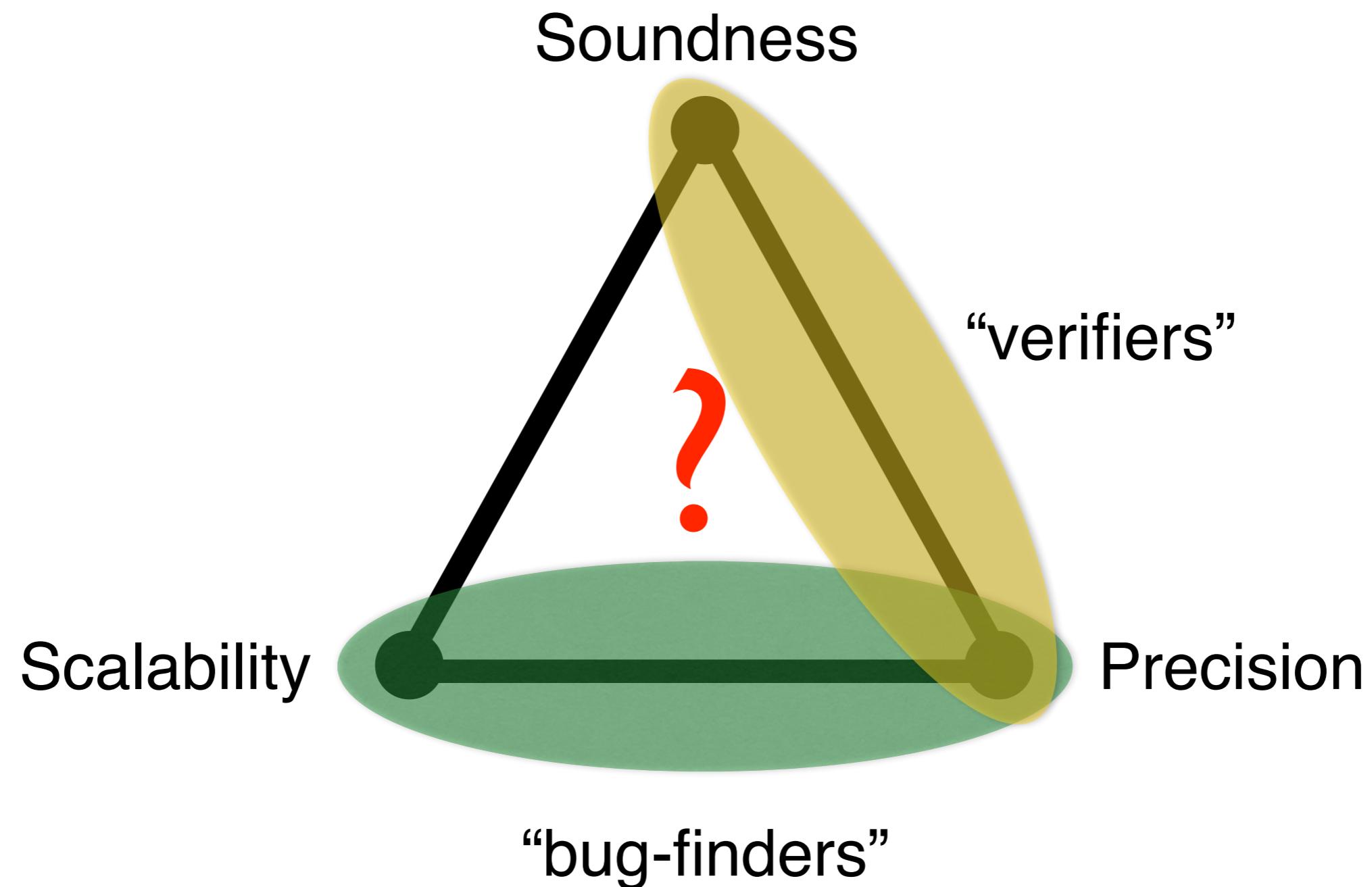
Hakjoo Oh¹ Wonchan Lee¹ Kihong Heo¹
Hongseok Yang² Kwangkeun Yi¹

¹Seoul National University
²University of Oxford

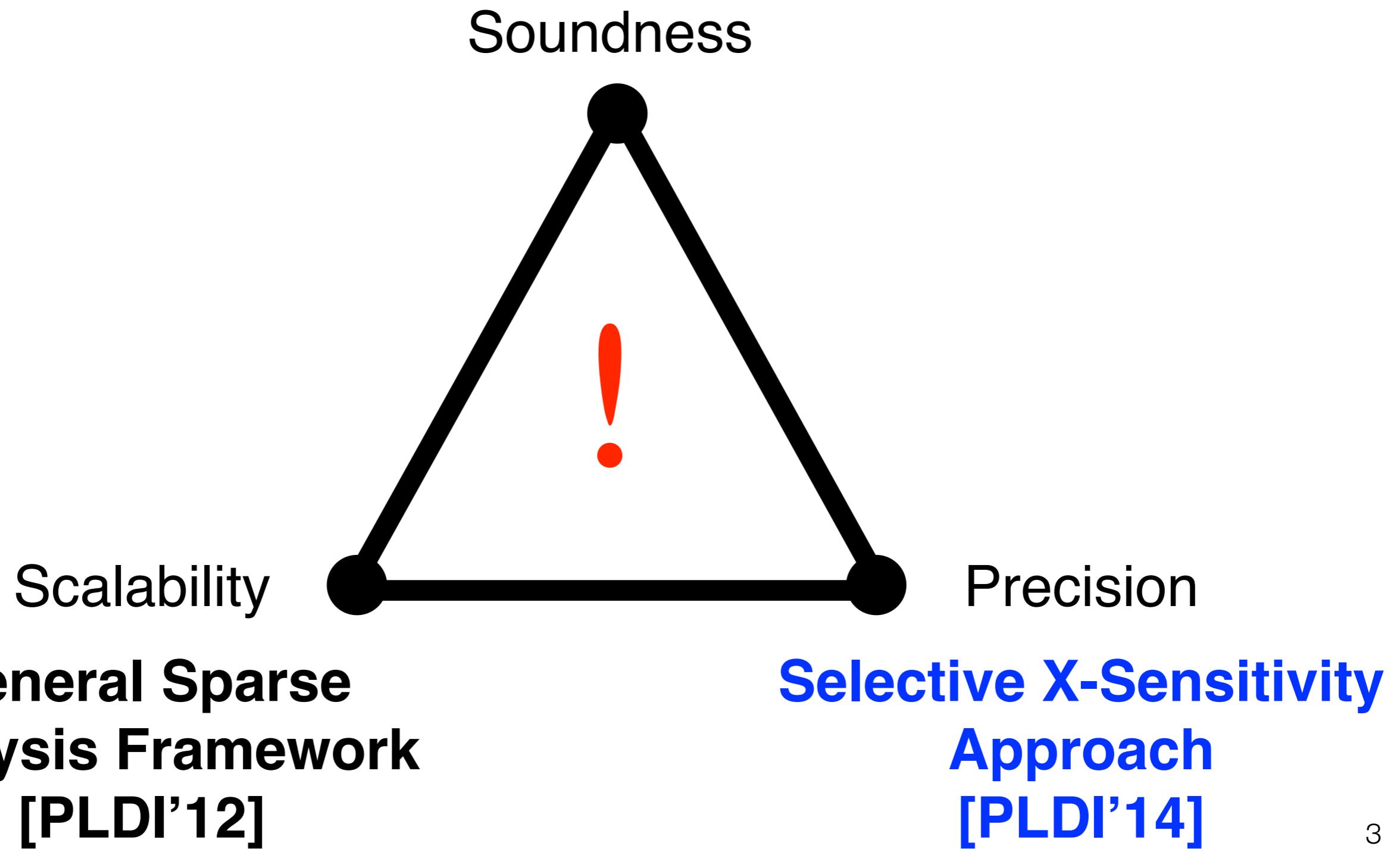
PLDI 2014 @Edinburgh, Scotland



Challenge in Static Analysis



Our Long-term Goal

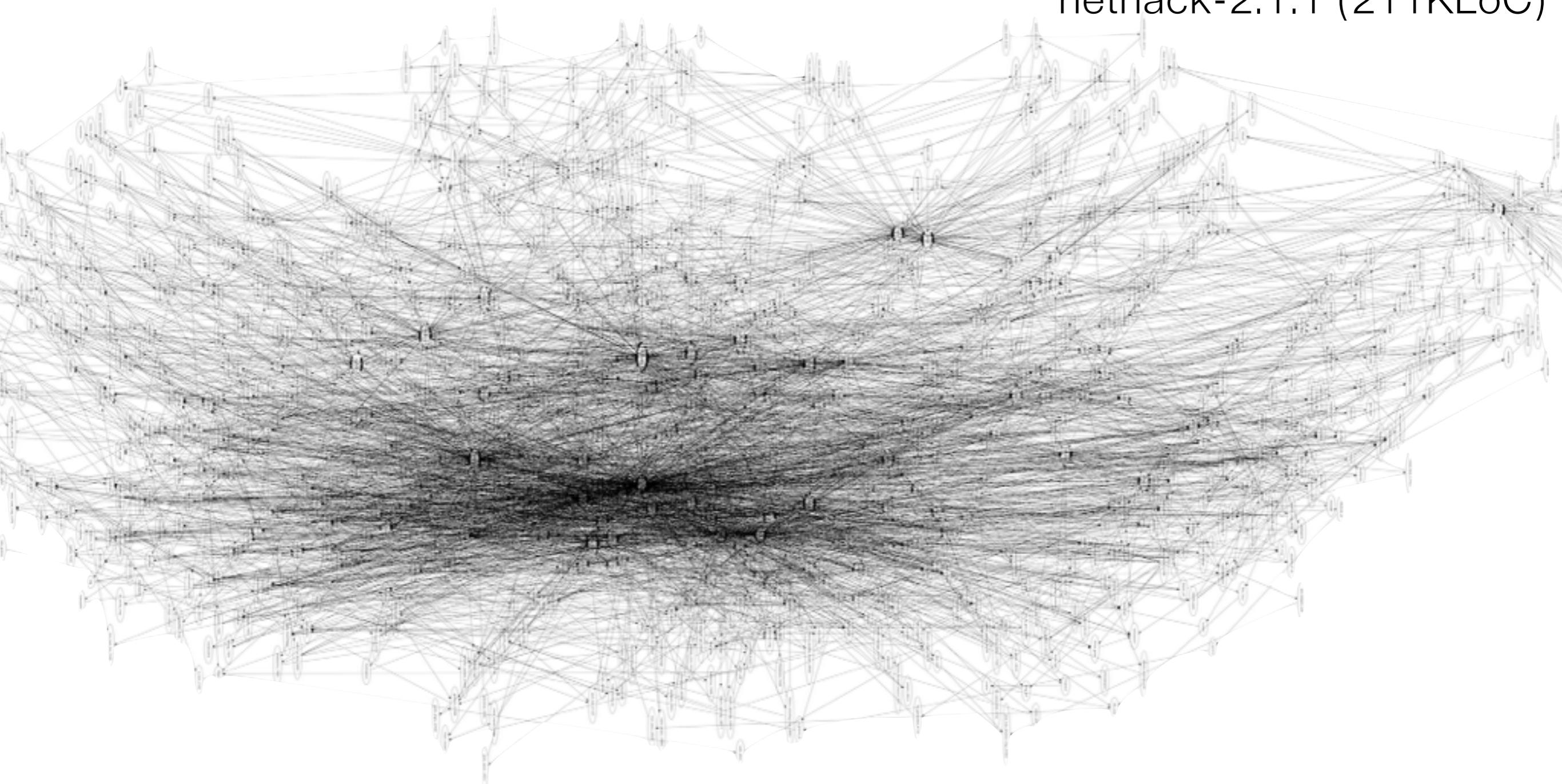


Motivation

- In 2007, we commercialized  Sparrow
The Early Bird
 - memory-bug-finding tool for full C
 - designed in abstract interpretation framework
 - sound in design, unsound yet scalable in reality
- Realistic workbench available
 - “let’s try to achieve sound, precise, yet scalable version”

The Challenge in Reality

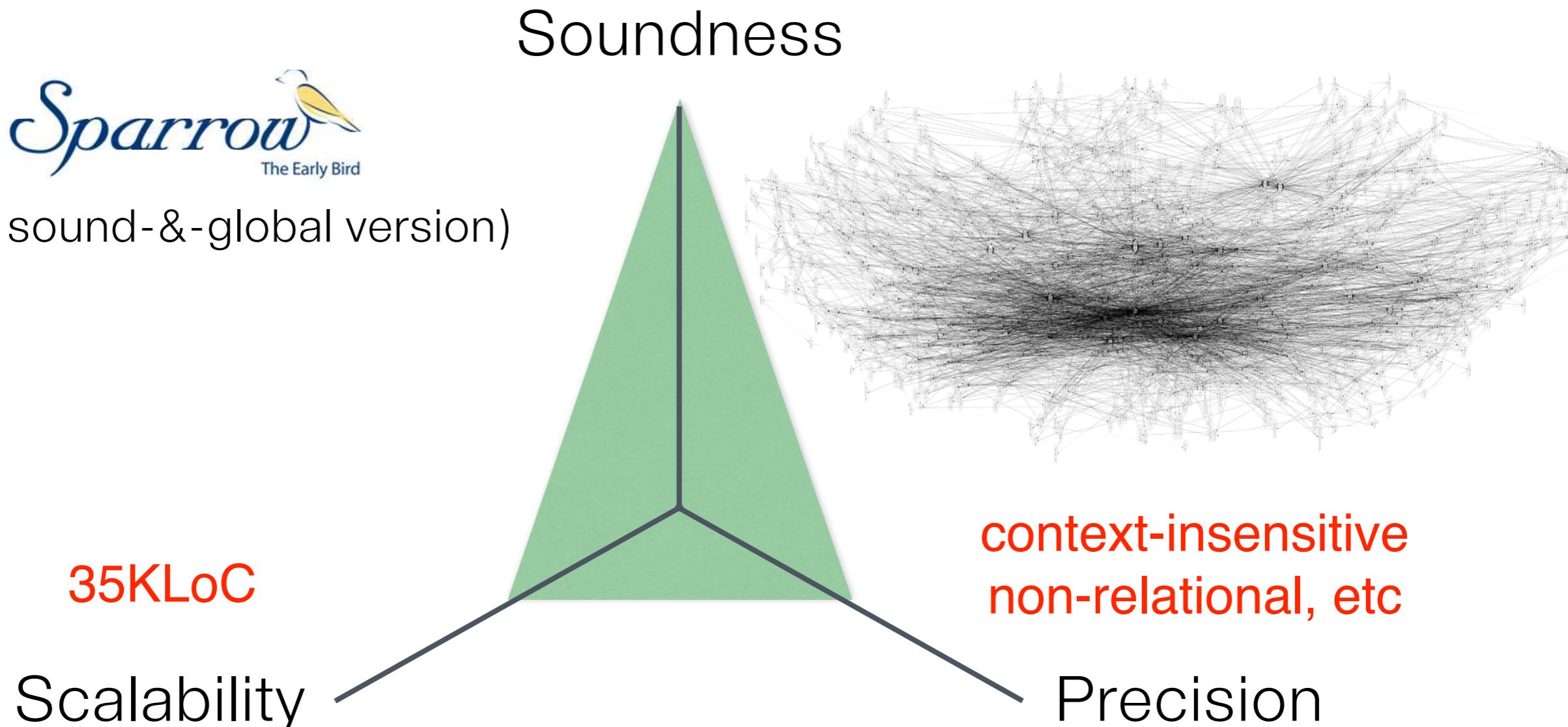
nethack-2.1.1 (211KLoC)



The Challenge in Reality



(2007, sound-&-global version)

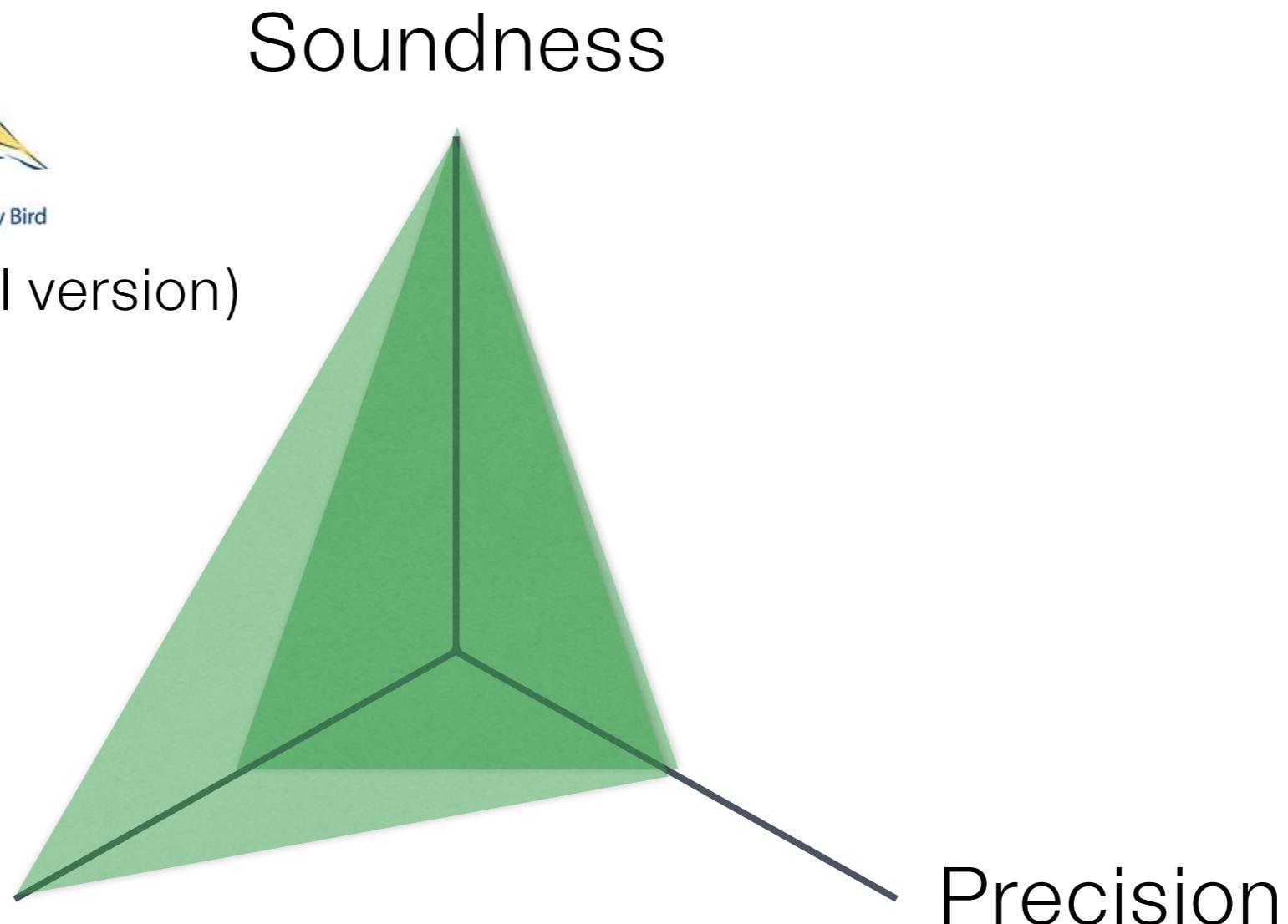


Scalability, Done.



(2012, sound-&-global version)

**General Sparse
Analysis Framework**
[PLDI'12]

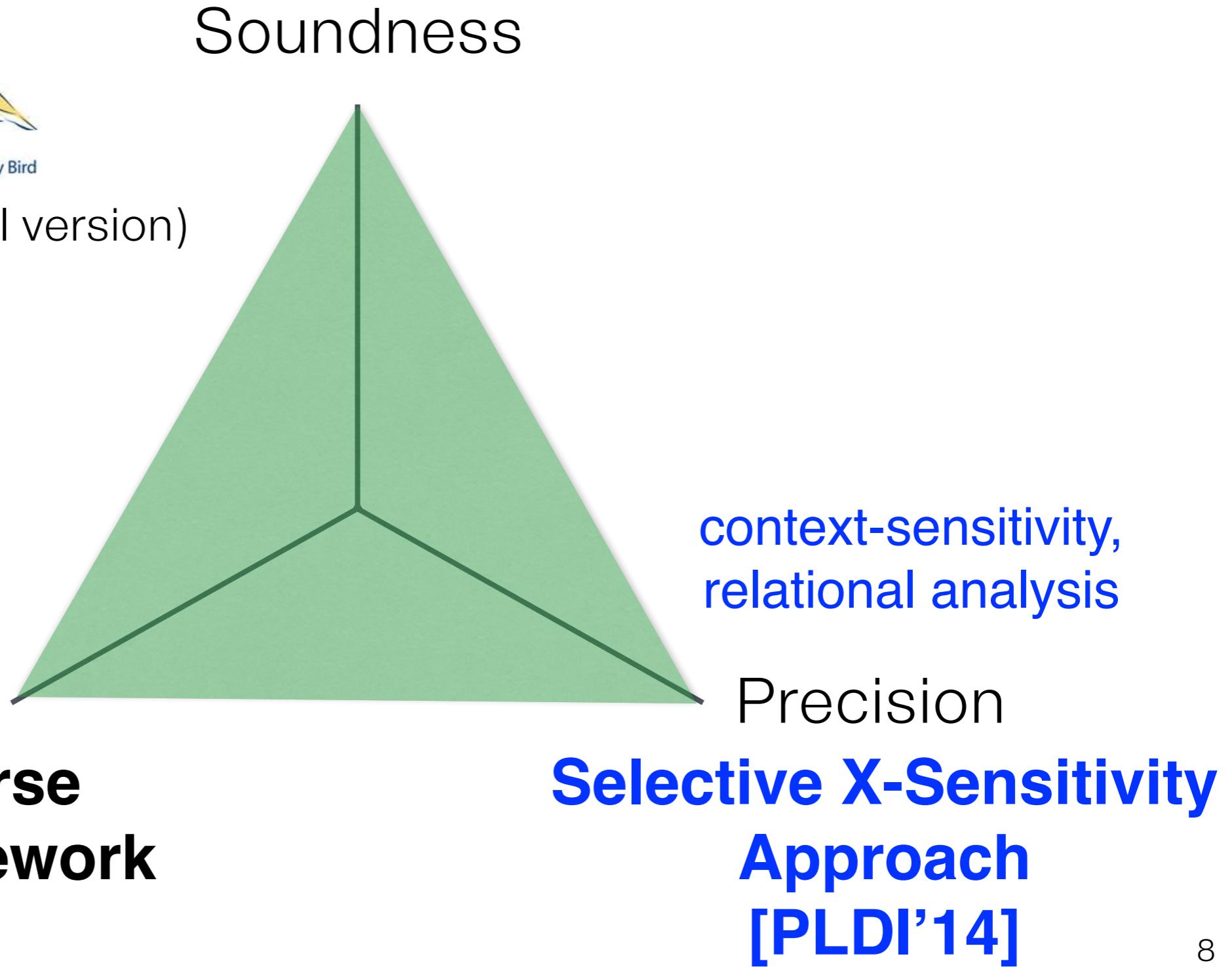


The Second Goal: Precision



(2014, sound-&-global version)

1 Million LoC
Scalability
General Sparse Analysis Framework
[PLDI'12]



Effectiveness for Context-Sensitivity

24% / 28%

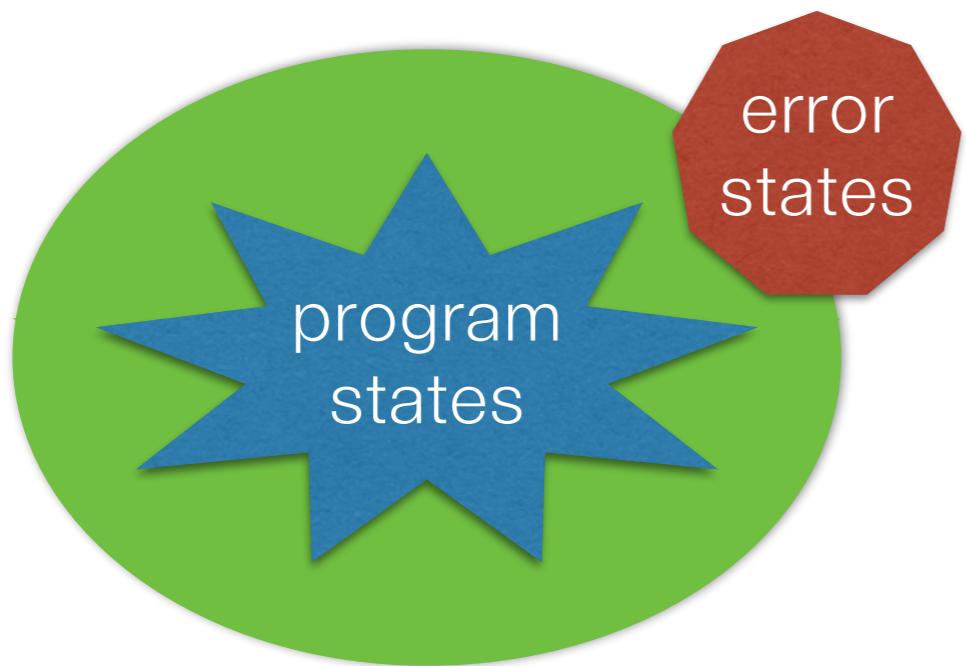
Reduction of
false alarms

Increase of
analysis time

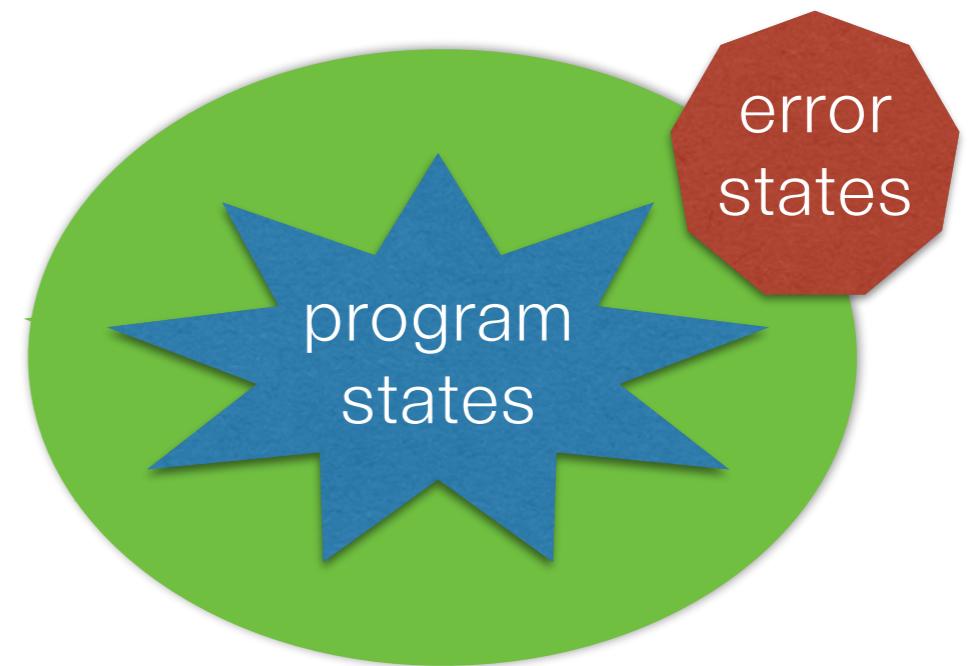
vs. context-insensitivity

Selective X-Sensitivity

- Apply precision(X) only when/where it matters
- X = context-sensitivity, relational analysis, etc



VS.



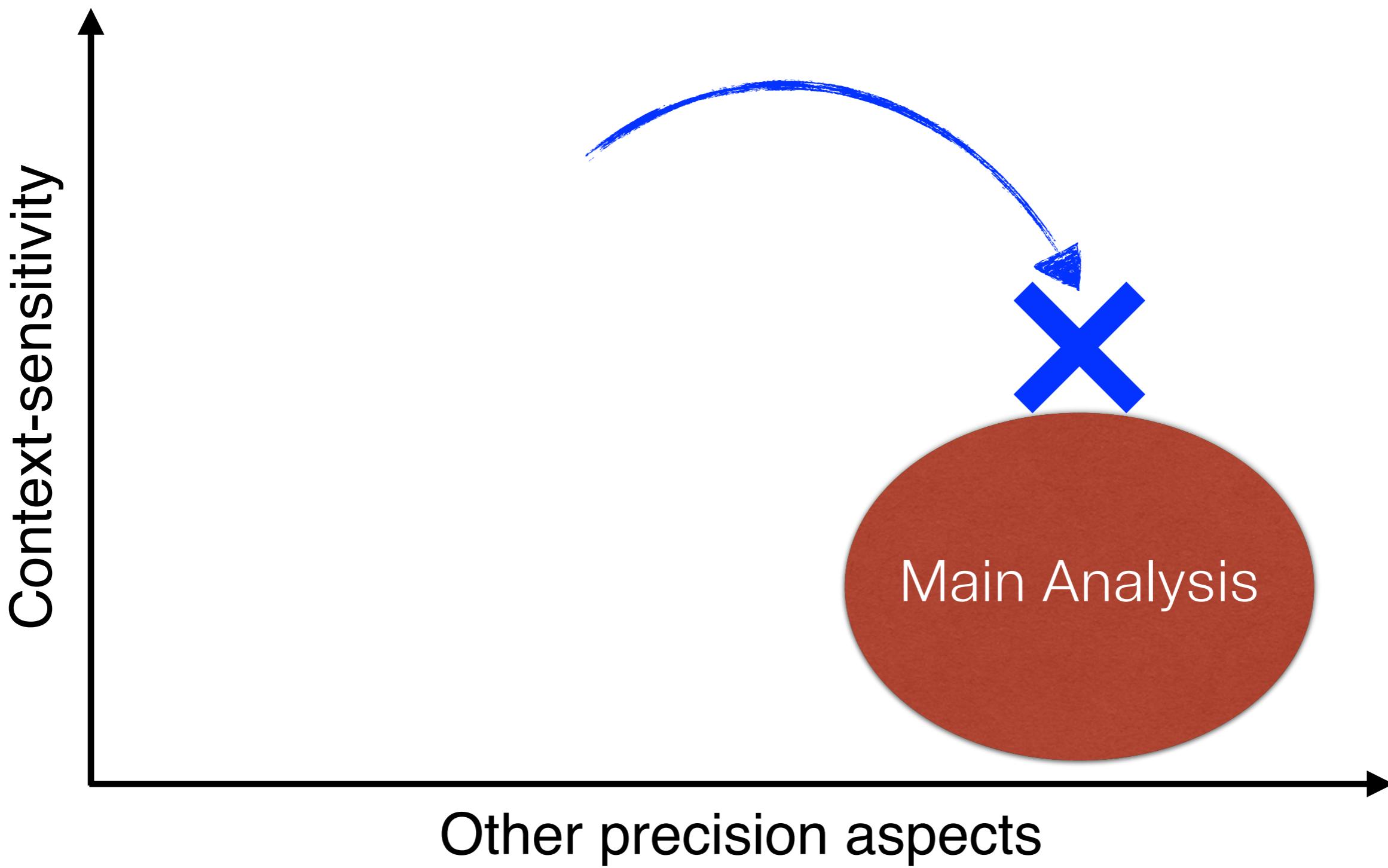
our method: **24%** / **28%**

3-CFA: **24%** / **1300%**

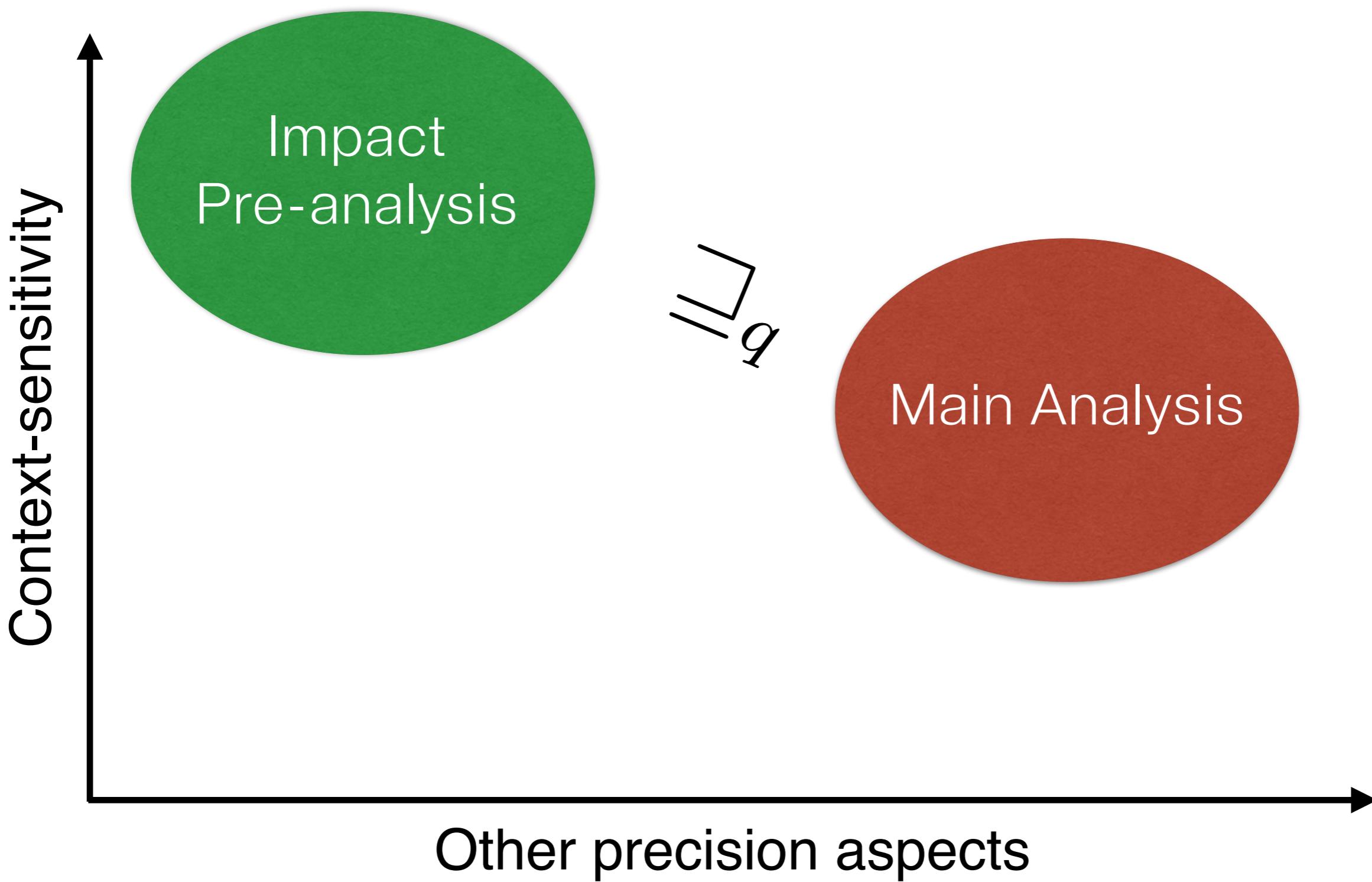
Key Idea: Impact Pre-Analysis

- Estimate the impact of X-sensitivity on main analysis
 - fully X-sensitive
 - but, approximated in other precision aspects

Key Idea: Impact Pre-Analysis



Impact Realization



Two Instance Analyses

- Selective context-sensitivity
- Selective relational analysis

Selective Context-Sensitivity

Example Program

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:   x = h(a);\n      assert(x > 1); // Q1 ← always holds\nc2:   y = h(input());\n      assert(y > 1); // Q2 ← does not always hold\n}\n\n\nc3: void g() {f(8);}\n\n    void m() {\nc4:   f(4);\nc5:   g();\nc6:   g();\n    }
```

Context-Insensitivity

```
int h(n) {ret n;}
```

void f(a) {
c1: x = h(a);
 assert(x > 1); // Q1
c2: y = h(input());
 assert(y > 1); // Q2
}

c3: void g() {f(8);}

void m() {
c4: f(4);
c5: g();
c6: g();
}

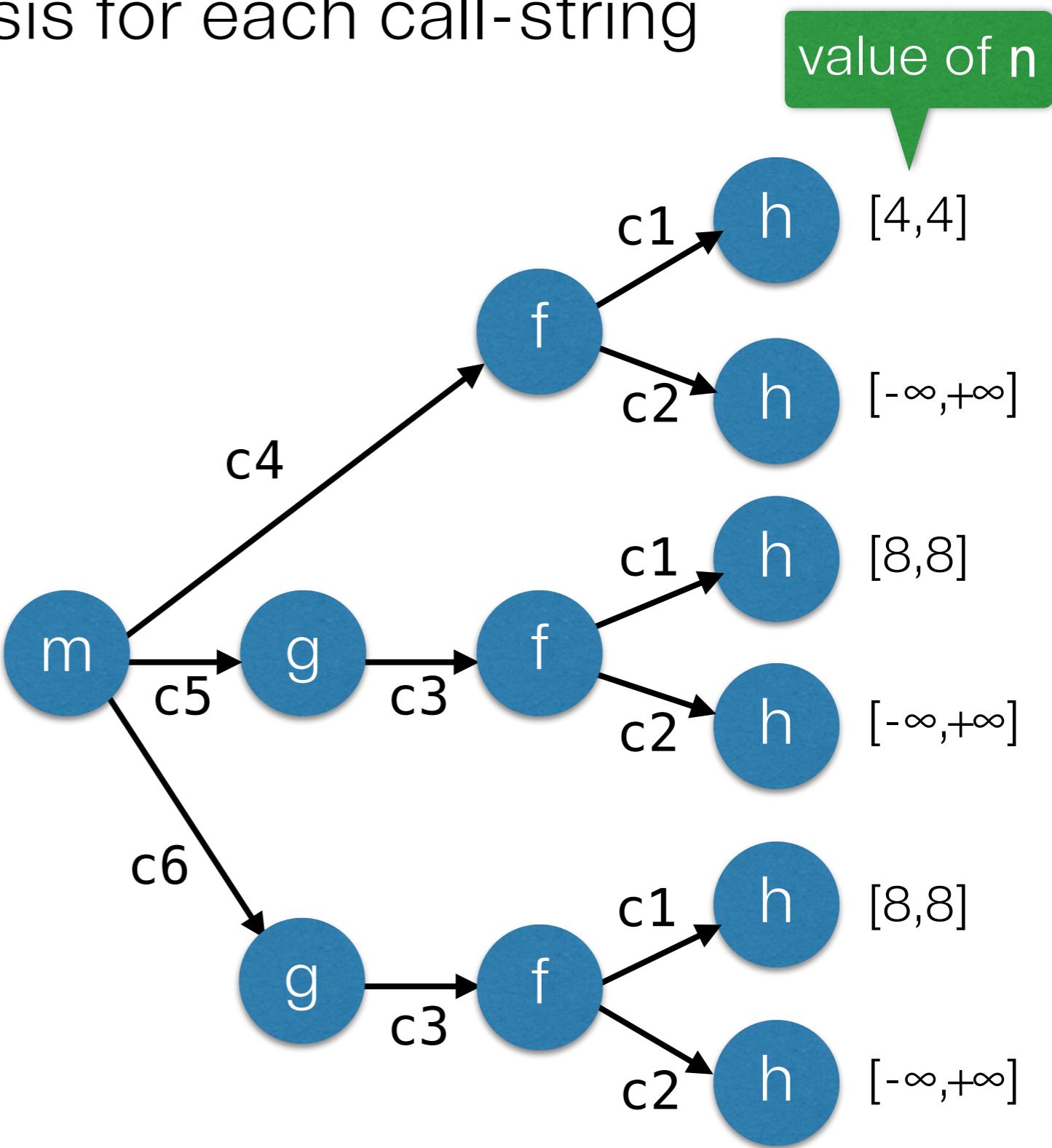
[-∞, +∞]

Context-insensitive interval analysis
cannot prove Q1

Context-Sensitivity: 3-CFA

Separate analysis for each call-string

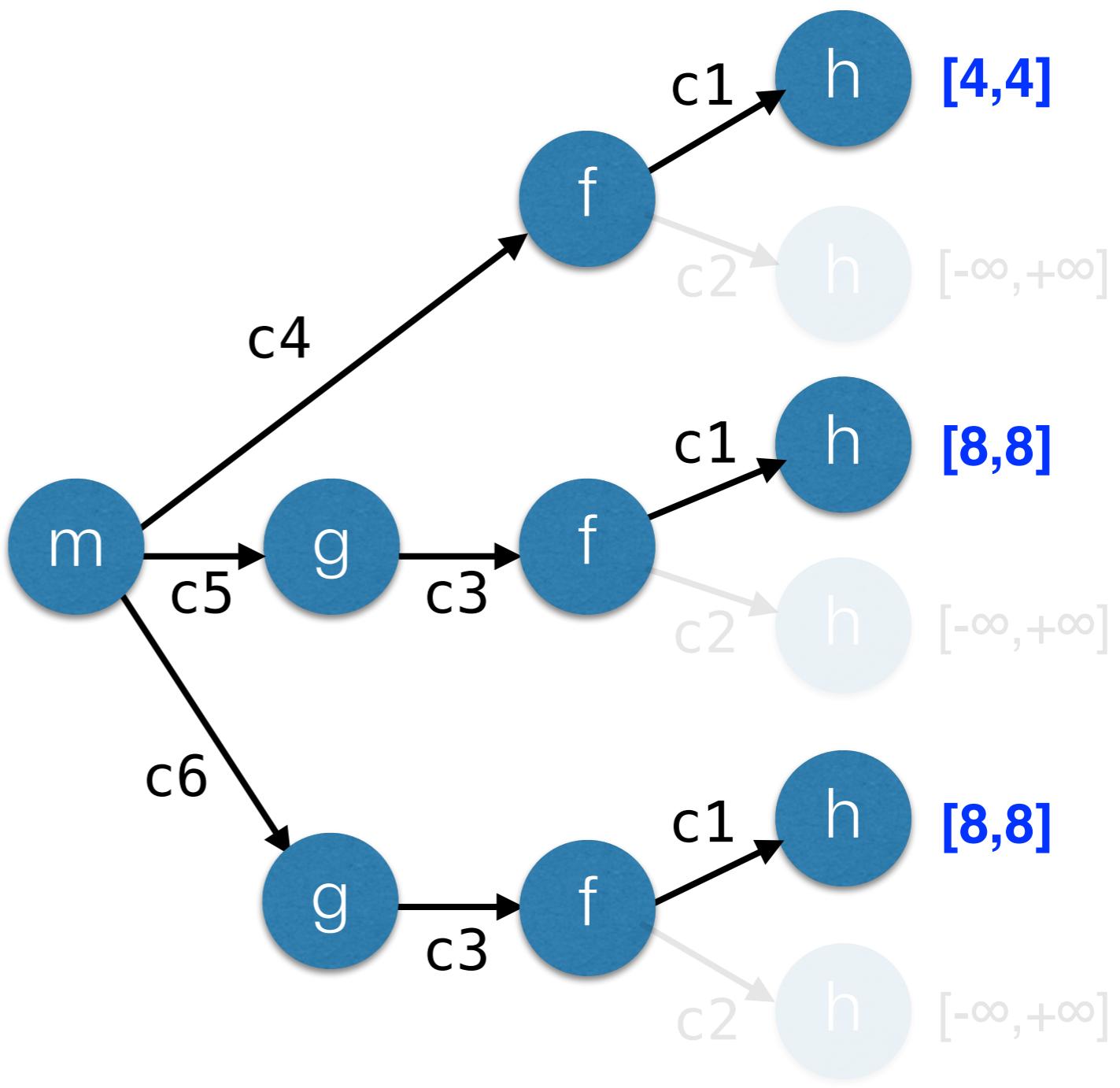
```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\nvoid g() {f(8);}\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```



Context-Sensitivity: 3-CFA

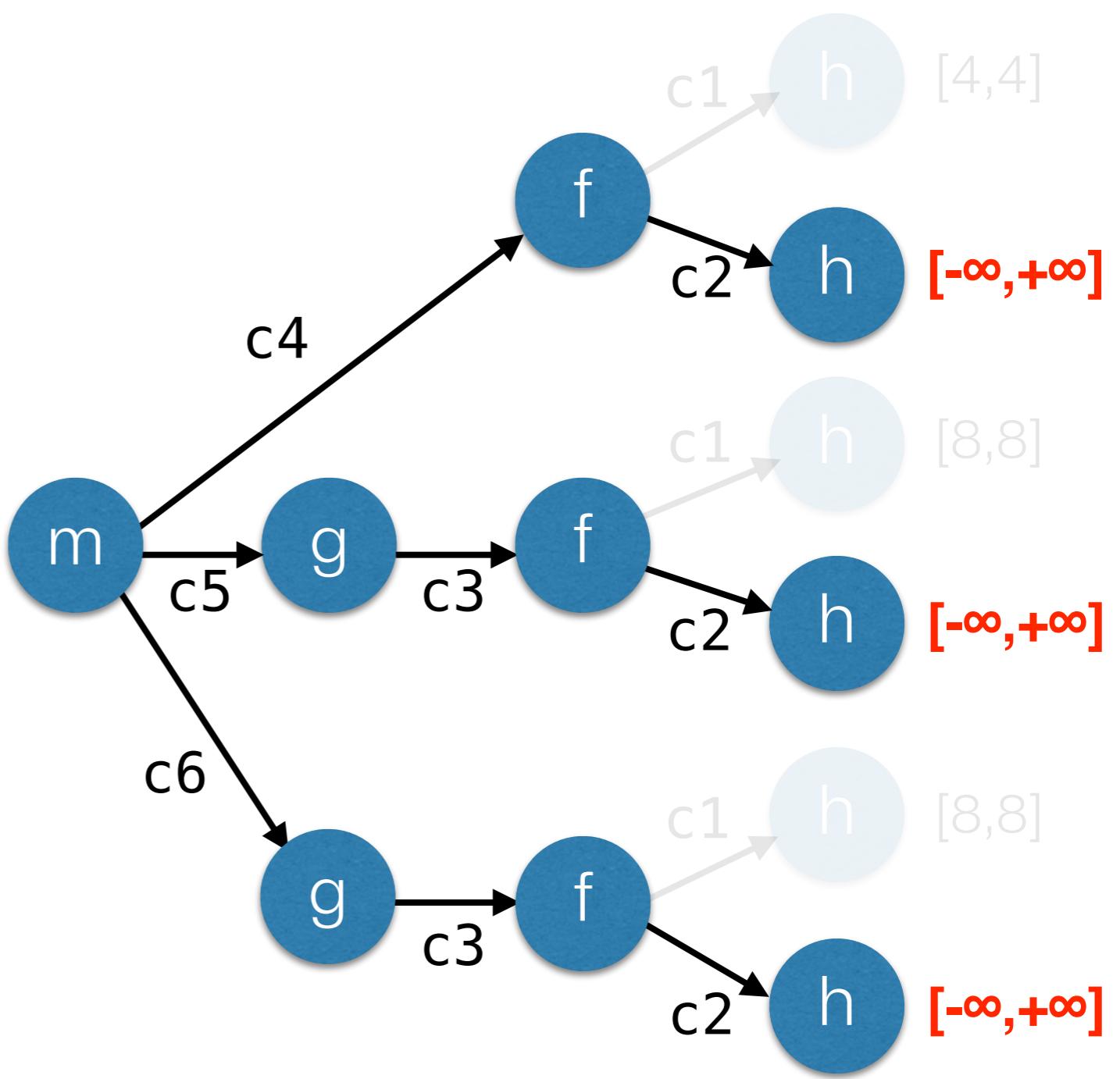
Separate analysis for each call-string

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\nvoid g() {f(8);}\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```



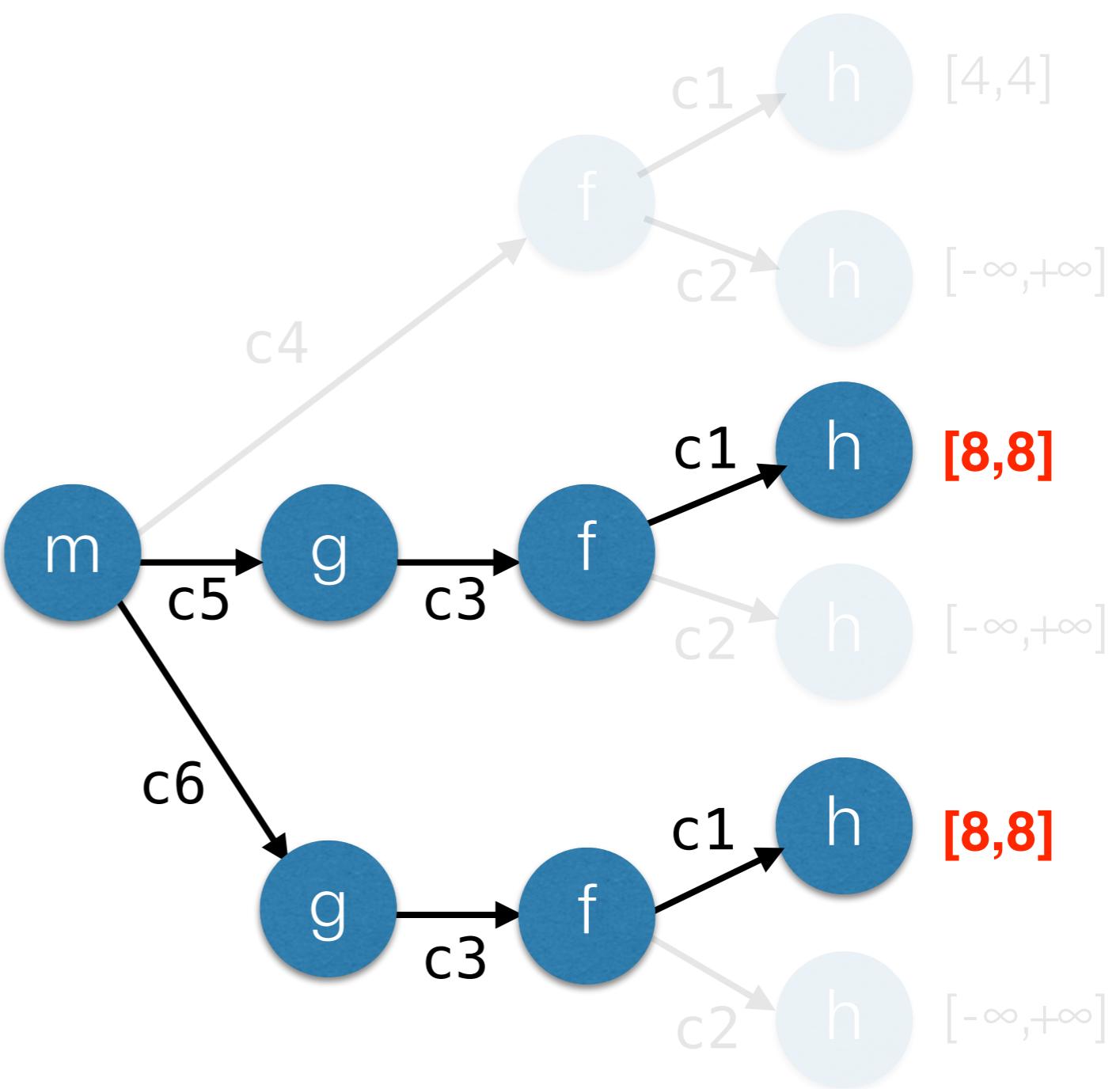
Problems of k-CFA

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\nvoid g() {f(8);}\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```



Problems of k-CFA

```
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```



Our Selective Context-Sensitivity

```
int h(n) {ret n;}
```

```
void f(a) {  
c1:  x = h(a);  
      assert(x > 1); // Q1  
c2:  y = h(input());  
      assert(y > 1); // Q2  
}
```

```
c3: void g() {f(8);}
```

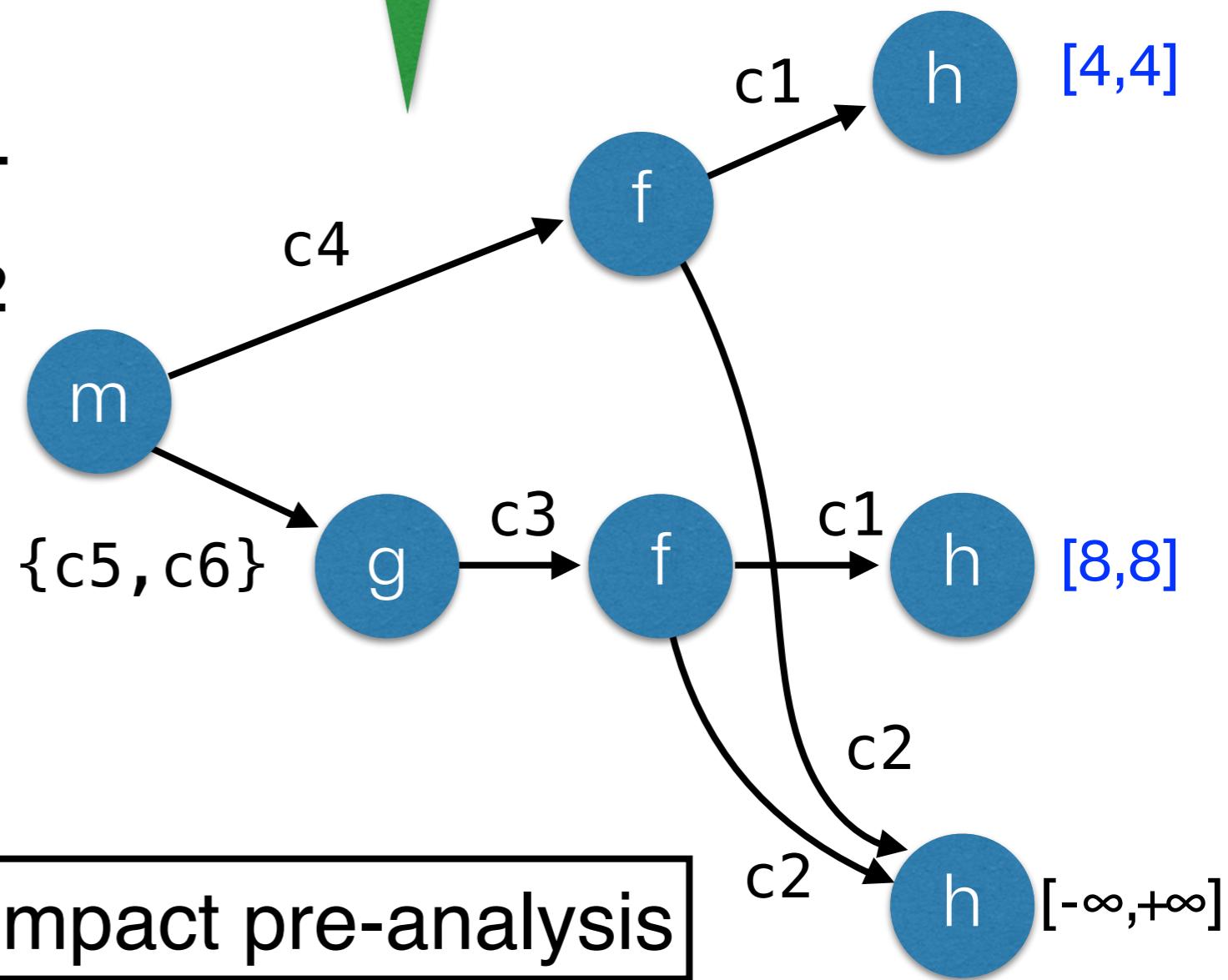
```
void m() {
```

```
c4:  f(4);
```

```
c5:  g();
```

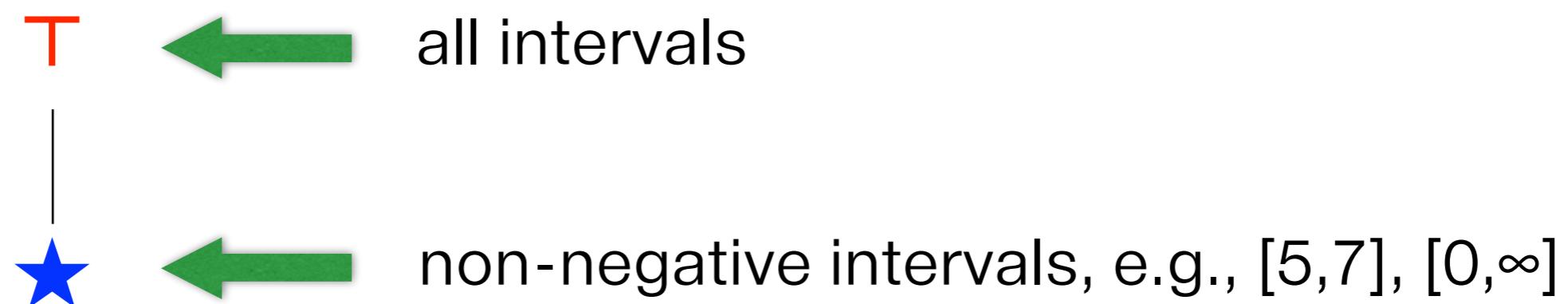
```
c6:  g();
```

Challenge: How to infer this selective context-sensitivity?



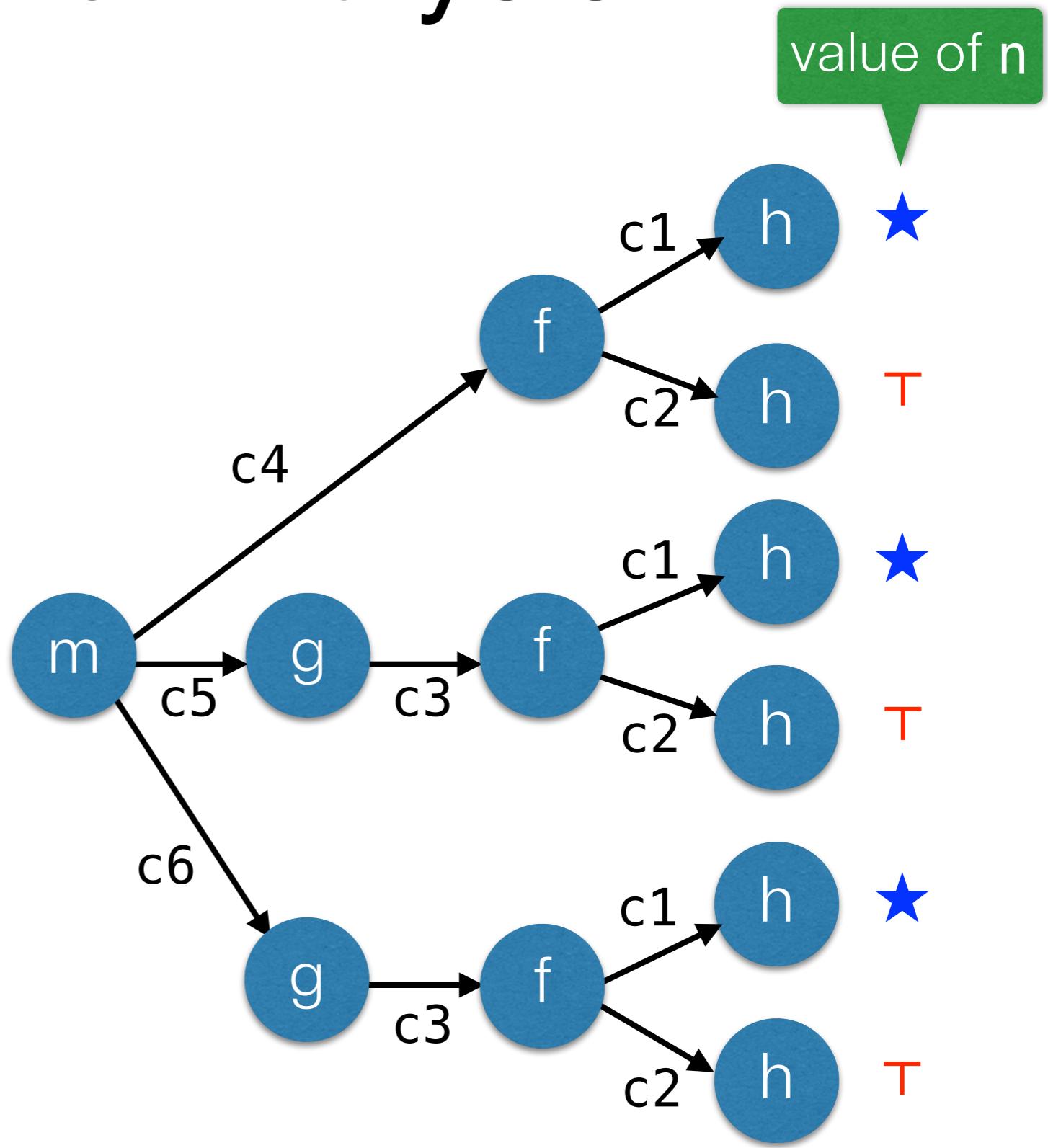
Impact Pre-Analysis

- Full context-sensitivity
- Approximate the interval domain



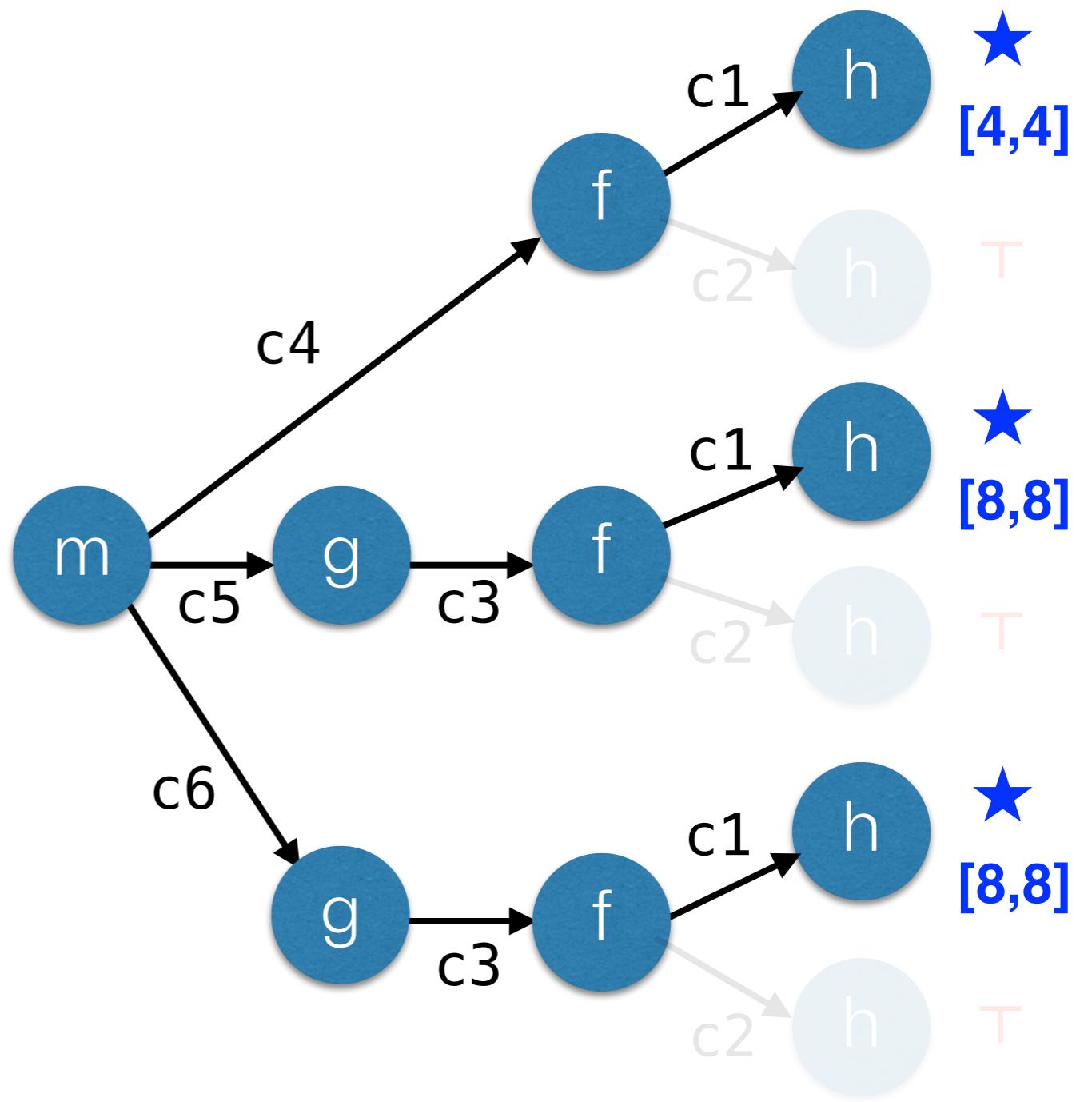
Impact Pre-Analysis

```
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```



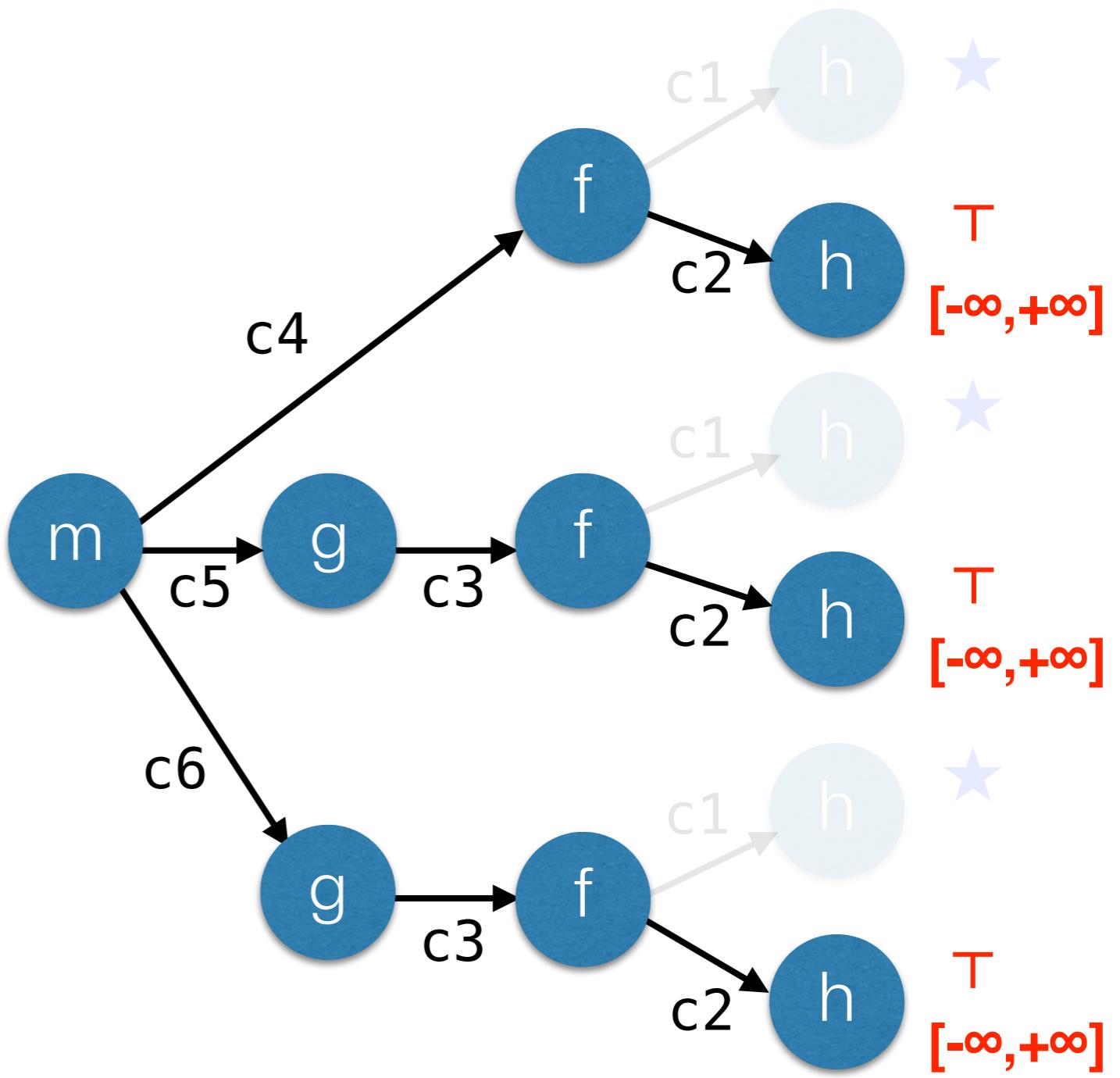
Impact Pre-Analysis

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\n\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\n\nc3: void g() {f(8);}\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```



Impact Pre-Analysis

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\nvoid g() {f(8);}\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```

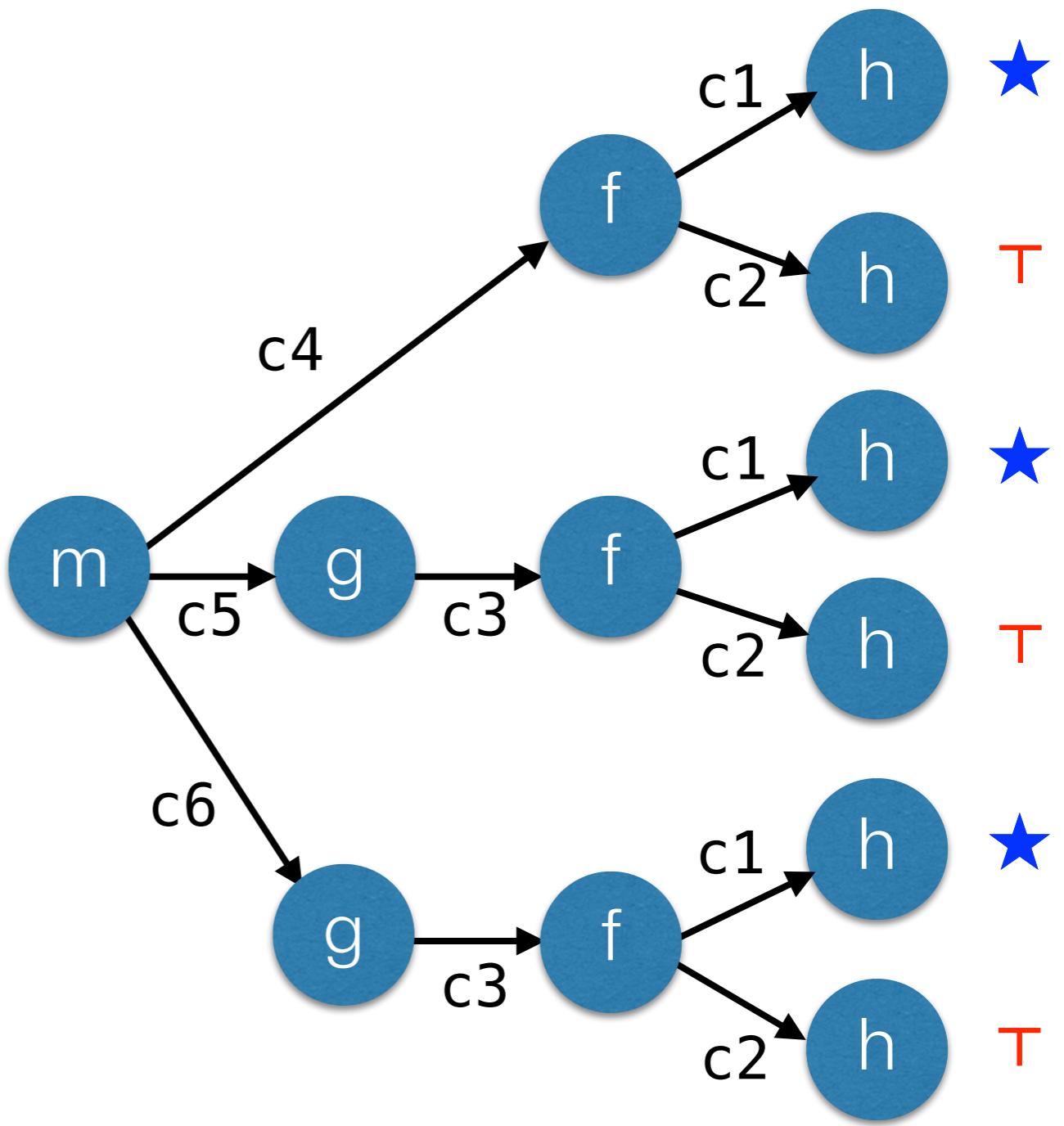


1. Collect queries whose expressions are assigned with ★

```
int h(n) {ret n;}
```

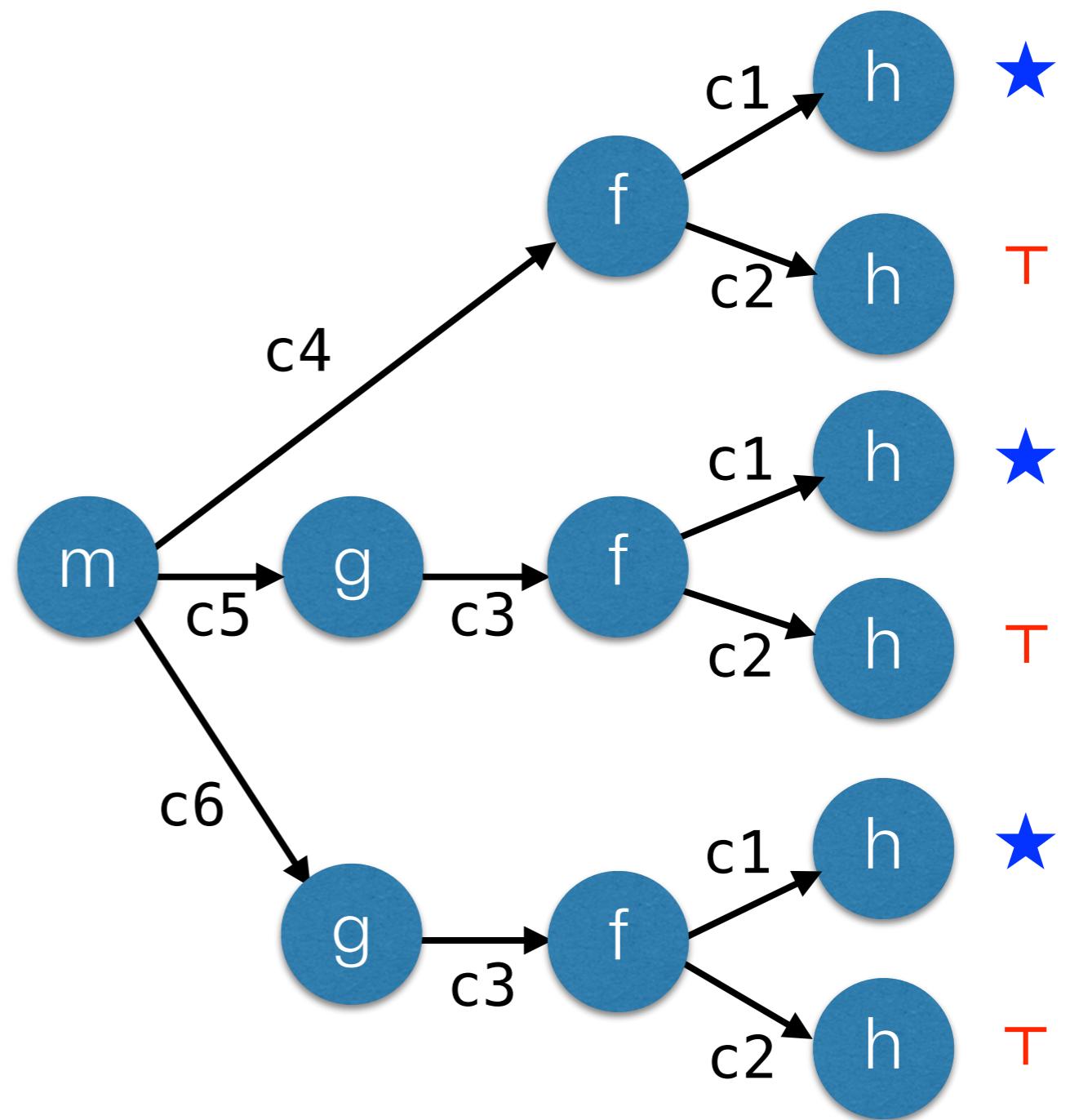
```
void f(a) {  
c1: ★ x = h(a);  
    assert(x > 1); // Q1  
c2: T y = h(input());  
    assert(y > 1); // Q2  
}  
c3: void g() {f(8);}
```

```
void m() {  
c4:   f(4);  
c5:   g();  
c6:   g();  
}
```



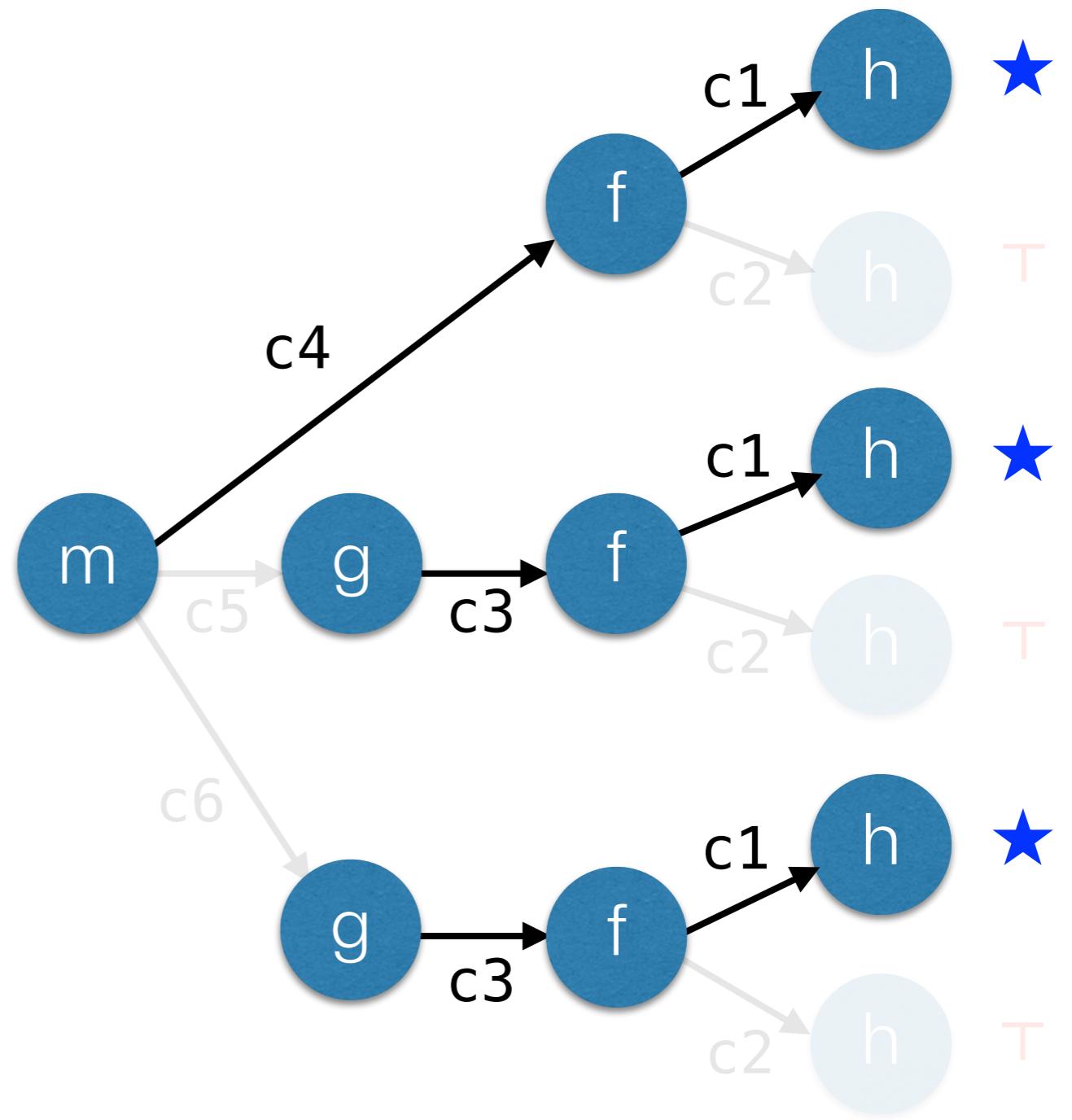
2. Find the program slice that contributes to the selected query

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1: x = h(a);\n      assert(x > 1); // Q1\n\nc2: y = h(input());\n      assert(y > 1); // Q2\n}\n\nc3: void g() {f(8);}\n\nvoid m() {\nc4: f(4);\nc5: g();\nc6: g();\n}
```



3. Collect contexts in the slice

```
int h(n) {ret n;}\n\nvoid f(a) {\nc1:  x = h(a);\n      assert(x > 1); // Q1\n\nc2:  y = h(input());\n      assert(y > 1); // Q2\n}\n\n\nc3: void g() {f(8);}\n\n\nvoid m() {\nc4:  f(4);\nc5:  g();\nc6:  g();\n}
```



=> Contexts for `h`: $\{c3 \cdot c1, c4 \cdot c1\}$

Selective Relational Analysis

Relational Analysis

```
a = b  
i < b  
1 int a = b;  
2 int c = input();  
3 for (i = 0; i < b; i++) {  
4     assert (i < a); // Q1  
5     assert (i < c); // Q2  
6 }
```

| | a | b | c | i |
|---|----------|----------|----------|----------|
| a | 0 | 0 | ∞ | -1 |
| b | 0 | 0 | ∞ | -1 |
| c | ∞ | ∞ | 0 | ∞ |
| i | ∞ | ∞ | ∞ | 0 |

$$i - a \leq -1$$

$$i - c \leq \infty$$

vs.

| | a | b | i |
|---|----------|----------|----|
| a | 0 | 0 | -1 |
| b | 0 | 0 | -1 |
| i | ∞ | ∞ | 0 |

non-selective analysis

our selective analysis

Impact Pre-Analysis

- Fully relational
- Approximated in other precision aspects

| | a | b | c | i |
|---|----------|----------|----------|----------|
| a | 0 | 0 | ∞ | -1 |
| b | 0 | 0 | ∞ | -1 |
| c | ∞ | ∞ | 0 | ∞ |
| i | ∞ | ∞ | ∞ | 0 |

octagon analysis

| | a | b | c | i |
|---|---|---|---|---|
| a | ★ | ★ | T | ★ |
| b | ★ | ★ | T | ★ |
| c | T | T | ★ | T |
| i | T | T | T | ★ |

vs.

impact pre-analysis

Experiments

- Implemented on top of  Sparrow
The Early Bird
 - Selective context-sensitive analysis
 - Selective octagon analysis
- Evaluated on 10 GNU benchmarks (2~100KLoC)

Selective Context-Sensitivity

| | | Context-Insensitive | | Ours | |
|--------------|-------------|---------------------|--------------|--------------|--------------|
| Pgm | LOC | #alarms | time(s) | #alarms | time(s) |
| spell | 2K | 58 | 0.6 | 30 | 0.9 |
| bc | 13K | 606 | 14.0 | 483 | 16.2 |
| tar | 20K | 940 | 42.1 | 799 | 47.2 |
| less | 23K | 654 | 123.0 | 562 | 166.4 |
| sed | 27K | 1,325 | 107.5 | 1,238 | 117.6 |
| make | 27K | 1,500 | 88.4 | 1,028 | 106.2 |
| grep | 32K | 735 | 12.1 | 653 | 15.9 |
| wget | 35K | 1,307 | 69.0 | 942 | 82.1 |
| a2ps | 65K | 3,682 | 118.1 | 2,121 | 177.7 |
| bison | 102K | 1,894 | 136.3 | 1,742 | 173.4 |
| TOTAL | 346K | 12,701 | 707.1 | 9,598 | 903.6 |

24.4%

Selective Context-Sensitivity

| | | Context-Insensitive | | Ours | |
|--------------|-------------|---------------------|--------------|--------------|--------------|
| Pgm | LOC | #alarms | time(s) | #alarms | time(s) |
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pre-analysis : 14.7%
 main analysis: 13.1%

27.8%

k-CFA did not scale

- 2 or 3-CFA did not scale over 10KLoC
 - e.g., for spell (2KLoC):
 - 3-CFA reported 30 alarms in 11.9s
 - cf) ours: 30 alarms in 0.9s
- 1-CFA did not scale over 40KLoC

Selective Octagon Analysis

| | | | Existing Approach [Miné06] | | Ours | |
|--------------|----------------|------------|-------------------------------|----------------|------------|---------------|
| Pgm | LOC | #queries | proven | time(s) | proven | time(s) |
| calc | 298 | 10 | 2 | 0.3 | 10 | 0.2 |
| spell | 2,213 | 16 | 1 | 4.8 | 16 | 2.4 |
| barcode | 4,460 | 37 | 16 | 11.8 | 37 | 30.5 |
| httptunnel | 6,174 | 28 | 16 | 26.0 | 26 | 15.3 |
| bc | 13,093 | 10 | 2 | 247.1 | 9 | 117.3 |
| tar | 20,258 | 17 | 7 | 1043.2 | 17 | 661.8 |
| less | 23,822 | 13 | 0 | 3031.5 | 13 | 2849.4 |
| a2ps | 64,590 | 11 | 0 | 29473.3 | 11 | 2741.7 |
| TOTAL | 135,008 | 142 | 44 | 33840.3 | 139 | 6418.6 |

+95

Selective Octagon Analysis

| | | | Existing Approach [Miné06] | | Ours | |
|--------------|----------------|------------|-------------------------------|----------------|------------|---------------|
| Pgm | LOC | #queries | proven | time(s) | proven | time(s) |
| calc | 298 | 10 | 2 | 0.3 | 10 | 0.2 |
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| a2ps | 64,590 | 11 | 0 | 29473.3 | 11 | 2741.7 |
| TOTAL | 135,008 | 142 | 44 | 33840.3 | 139 | 6418.6 |

reduce time by -81%

Summary

- A method for **precise** yet **scalable** static analysis
 - Impact pre-analysis + Selective main analysis
- Generally applicable
 - context-sensitivity, relational analysis, etc

