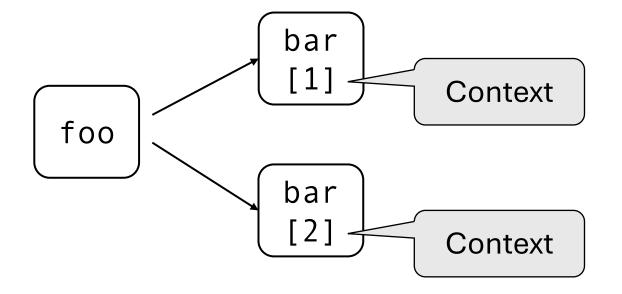
Return of CFA: Call-Site Sensitivity Can Be Superior to Object Sensitivity

Even for Object-Oriented Programs

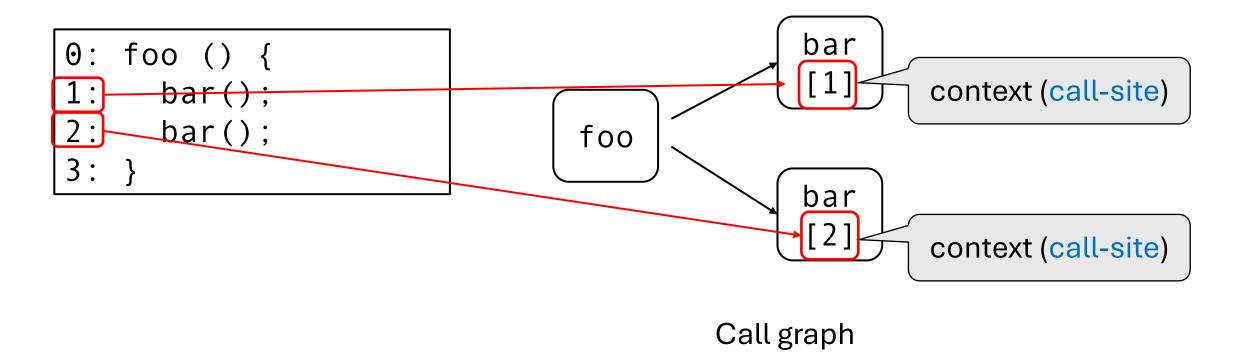
Call-Site Sensitivity considers "where"

```
0: foo () {
1: bar();
2: bar();
3: }
```

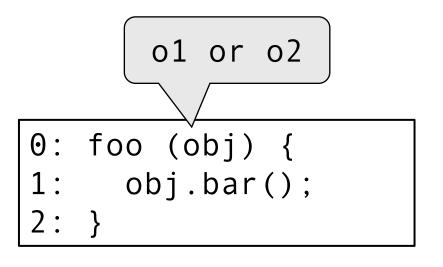


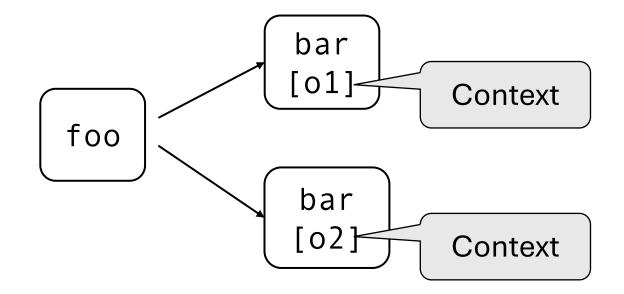
Call graph

Call-Site Sensitivity considers "where"



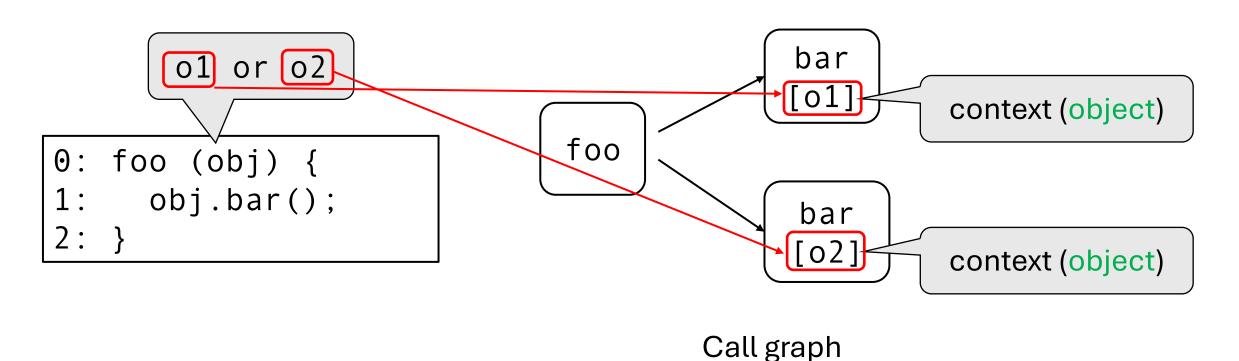
Object Sensitivity considers "what"





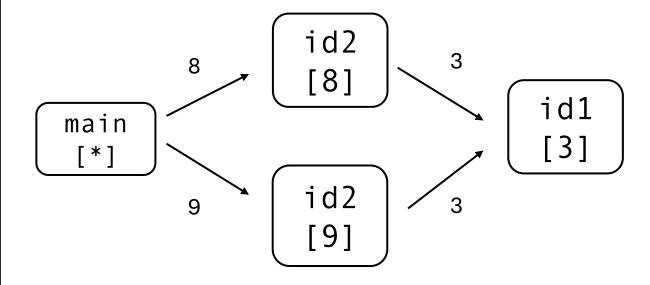
Call graph

Object Sensitivity considers "what"



Example: weakness of call-site sensitivity and strength of object sensitivity

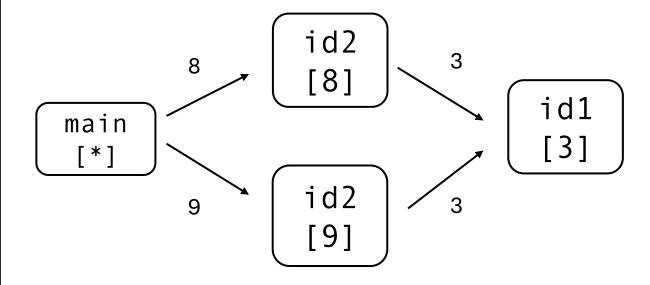
```
1 : class C {
 : id1(v) { return v };
   id2(v) { return id1(v) };
 : main() {
 : c1 = new C();
 : c2 = new C();
8 : A = (A) c1.id2(new A());
9 : B b = (B) c2.id2(new B());
10: }
```



Call graph of 1-call-site

Example: weakness of call-site sensitivity and strength of object sensitivity

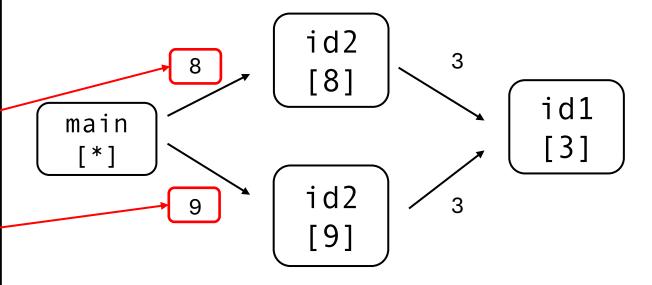
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 : id1(v) { return v };
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10: }
```



Call graph of 1-call-site

Example: weakness of call-site sensitivity and strength of object sensitivity

```
: class C {
 : id1(v) { return v };
   id2(v) { return id1(v) };
  : main() {
    c1 = new C();
      c2 = \text{new C()};
8
      A = (A) c1.id2(new A());
9
      B b = (B) c2.id2(new B());
10: }
```

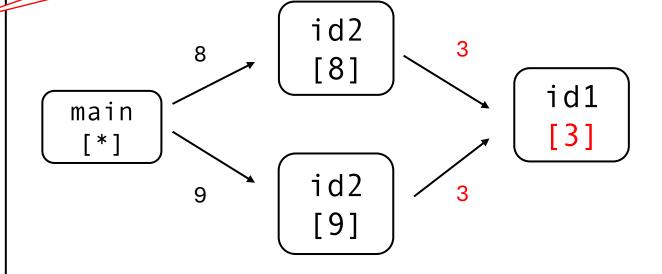


Call graph of 1-call-site

Example: weakness of call-site sensitivity and

```
: class C {
              return v };
     id1(v)
     id2(v) { return id1(v) };
   main() {
   c1 = new C();
 : c2 = new C();
 : A = (A) c1.id2(new A());
   B b = (B) c2.id2(new B());
10: }
```

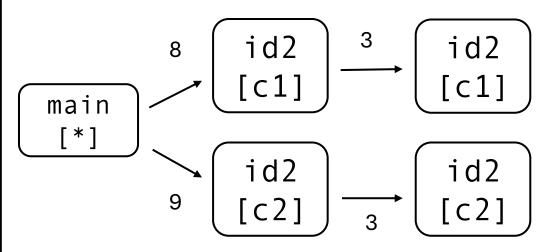
Weakness:
nested method calls



Call graph of 1-call-site

Example: weakness of call-site sensitivity and strength of object sensitivity

```
1 : class C {
   id1(v) { return v };
   id2(v) { return id1(v) };
 : main() {
 : c1 = new C();
 : c2 = new C();
8 : A = (A) c1.id2(new A());
9 : B b = (B) c2.id2(new B());
10: }
```



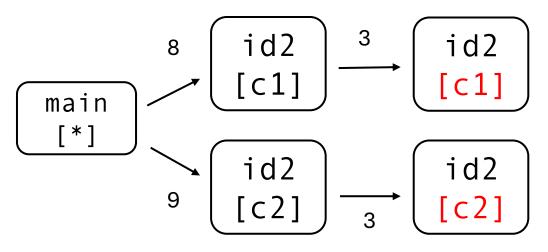
Call graph of 1-object

Example: weal

```
Strength: c1 or c2
```

```
: class C {
      id1(v)
               return
     id2(v)
             { return
                      id1(v)
   main()
      c1 = new C();
        = new C();
     A = (A) c1.id2(new A());
     B b = (B) c2.id2(new B());
10: }
```

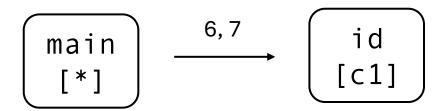
ty and strength of object sensitivity



Call graph of 1-object

Example: weakness of object sensitivity and strength of call-site sensitivity

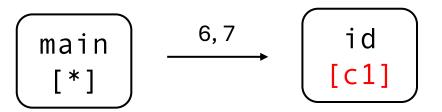
```
1 : class C {
2 : id(v) { return v; }
3 : }
4 : main() {
5 : c1 = new C();
6 : a = (A) c1.id(new A());
7 : b = (B) c1.id(new B());
8 : }
```



Call graph of 1-object

Example: weakness of object sensitivity and strength of call-site sensitivity

```
1 : class C {
2 : id(v) { return v; }
3 : }
4 : main() {
5 : c1 = new C();
6 : a = (A) c1.id(new A());
7 : b = (B) c1.id(new B());
8 : }
```



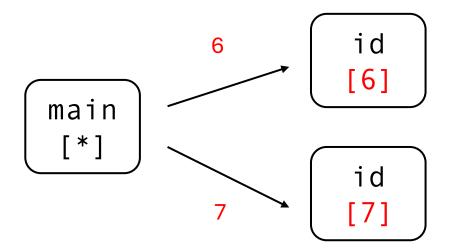
Call graph of 1-object

Weakness:

The two method calls share the same object c1

Example: weakness of object sensitivity and strength of call-site sensitivity

```
1 : class C {
2 : id(v) { return v; }
3 : }
4 : main() {
5 : c1 = new C();
6 : a = (A) c1.id(new A());
7 : b = (B) c1.id(new B());
8 : }
```



Call graph of 1-call-site

Strength:

Eeasily seperates the two method calls

The Status Quo: Object sensitivity outperforms call-site sensitivity

1981: Call-Site sensitivity proposed

2002: Object sensitivity proposed

2002 ~ 2010: Object vs Call-site

2010 ~ 2022: Object win

Researchers focused on improving Object sensitivity approach

The Status Quo: Object sensitivity outperforms call-site sensitivity

1981: Call-Site sensitivity proposed

2002: Object sensitivity proposed

2002 ~ 2010: Object vs Call-site

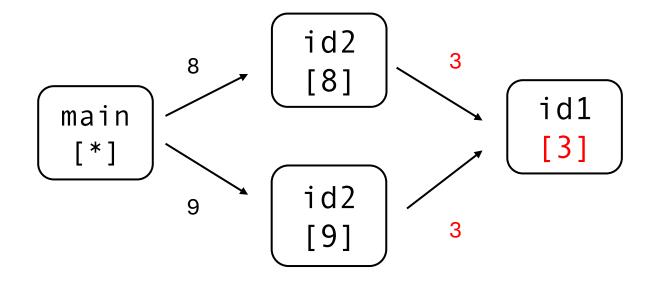
2018: Context tunneling proposed

2010 ~ 2022: Object win

Researchers focused on improving Object sensitivity approach

Context tunneling can remove the weakness of call-site sensitivity

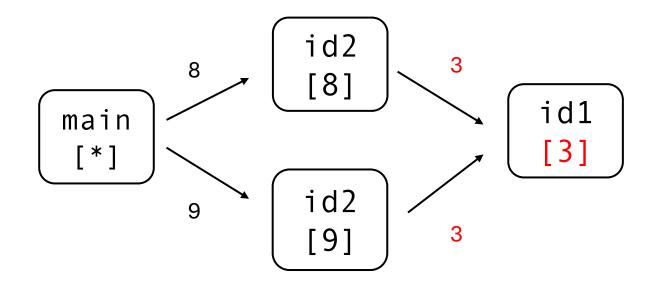
```
: class C {
     id1(v)
            { return v };
     id2(v) { return id1(v) };
   main() {
   c1 = new C();
 : c2 = new C();
8 : A = (A) c1.id2(new A());
   B b = (B) c2.id2(new B());
10: }
```



Call graph of 1-call-site

Context tunneling can remove the weakness of call-site sensitivity

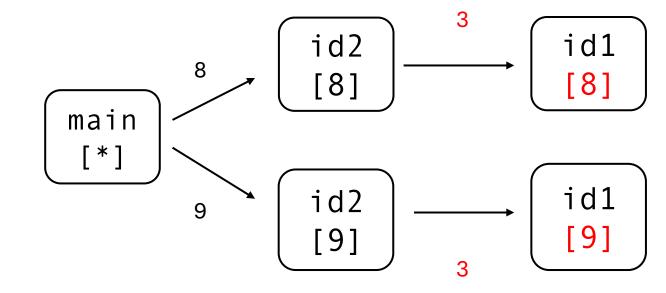




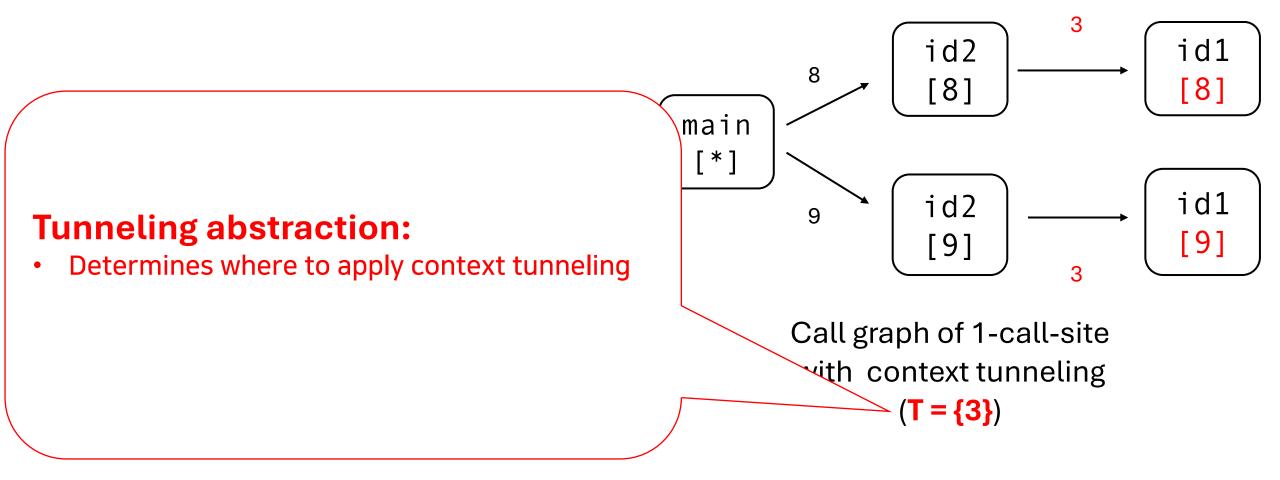
Call graph of 1-call-site

Context tunneling can remove the weakness of call-site sensitivity

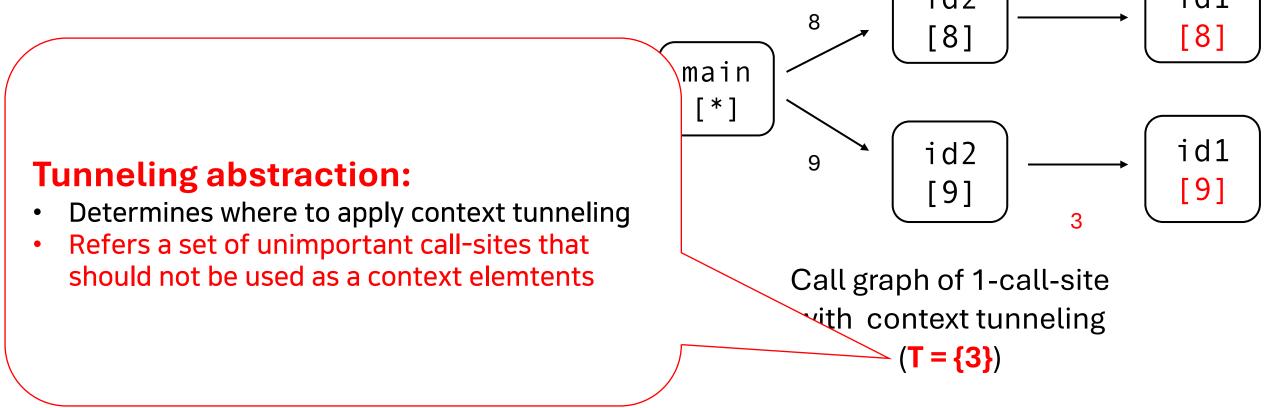




Context tunneling can remove the weakness of call-site sensitivity



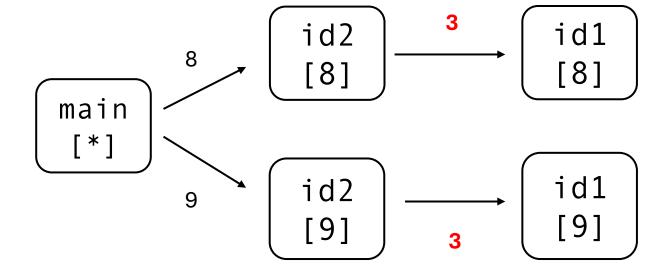
Context tunneling can remove the weakness of call-site sensitivity



Context tunneling can remove the weakness of call-site sensitivity

Apply context tunneling:

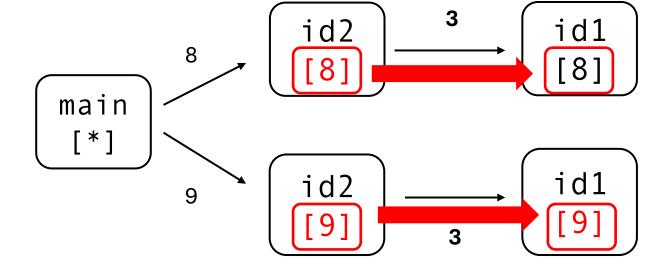
1. Detect tunneling abstraction (T = {3})



Context tunneling can remove the weakness of call-site sensitivity

Apply context tunneling:

- 1. Detect tunneling abstraction (T = {3})
- 2. Inherit caller method's context



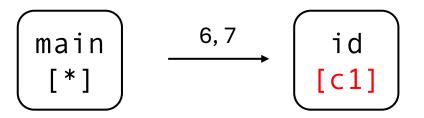
Context tunneling can remove the weakness of call-site sensitivity



Call graph of 1-call-site

Context tunneling can't remove the weakness of object sensitivity

```
1 : class C {
2 : id(v) { return v; }
3 : }
4 : main() {
5 : c1 = new C();
6 : a = (A) c1.id(new A());
7 : b = (B) c1.id(new B());
8 : }
```



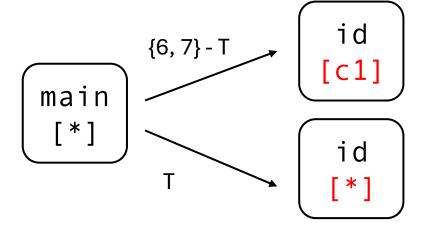
Call graph of 1-object

Weakness:

The two method calls share the same object c1

Context tunneling can't remove the weakness of object sensitivity

```
1 : class C {
2 : id(v) { return v; }
3 : }
4 : main() {
5 : c1 = new C();
6 : a = (A) c1.id(new A());
7 : b = (B) c1.id(new B());
8 : }
```



Call graph of 1-call-site with context tunneling

$$(T = \{?\})$$

Unable to separate the two method calls with **two context (c1 and *)**

Obervation

When context tunneling is included,

- Weakness of call-site sensitivity is removed
- Weakness of object sensitivity is not removed

Obervation

When context tunneling is included,

- Weakness of call-site sensitivity is removed
- Weakness of object sensitivity is not removed

Claim

When context tunneling is included,

Call-site sensitivity is more precise than obejct sensitivity

Obervation

When context tunneling is included,

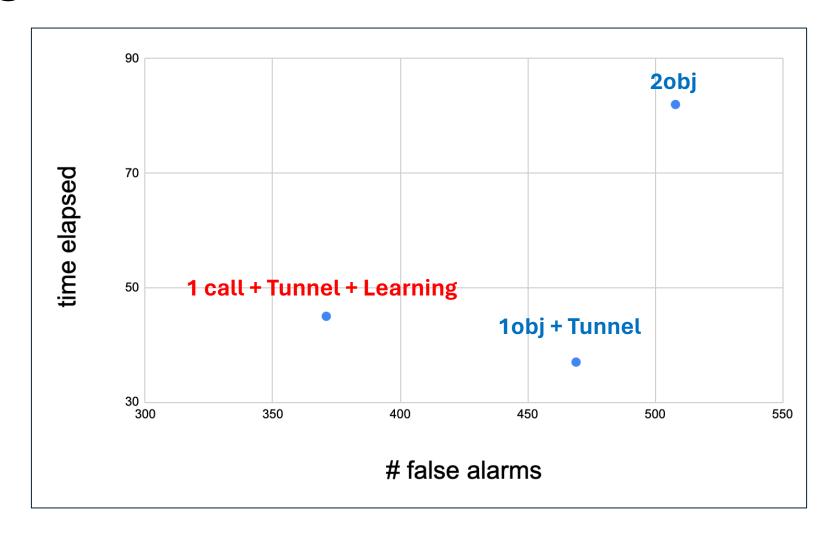
- Weakness of call-site sensitivity is removed
- Weakness of object sensitivity is not removed

Claim

When context tunneling is included,

Call-site sensitivity is more precise than obejct sensitivity

Results



More details about Obj2CFA

- Obj2CFA uses simulation technique
 - 1. Runs the object-sensitive analysis to obtain it's call graph
 - 2. Infers a tunneling abstraction
- Simulation: Finding more precise call-site sensitivity, but expensive
 - Apply Simulation-guided Learning to Improve scalability

Simulation takes a call-graph and infers a tunneling abstraction

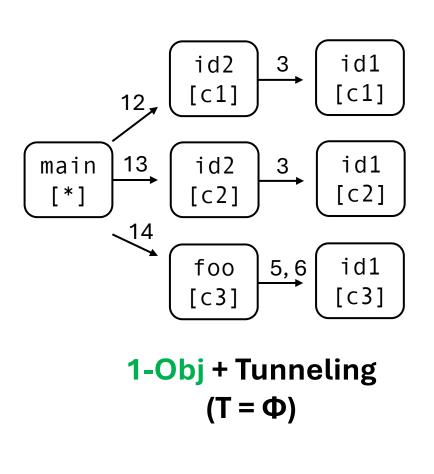
```
: class C {
      id1(v)
             { return v };
      id2(v) { return id1(v)};
     (foo()
     A a = (A)this.id1(new A());
     B b = (B)this.id1(new B());}
  : main() {
      c1 = new C();
10:
    c2 = new C():
11:
     c3 = new C();
12:
     (A \ a = (A) \ c1.id2(new \ A());
13:
     B b = (B) c2.id2(new B());
      c3.foo();
14:
15: }
```

Weakness of call-site sensitivity

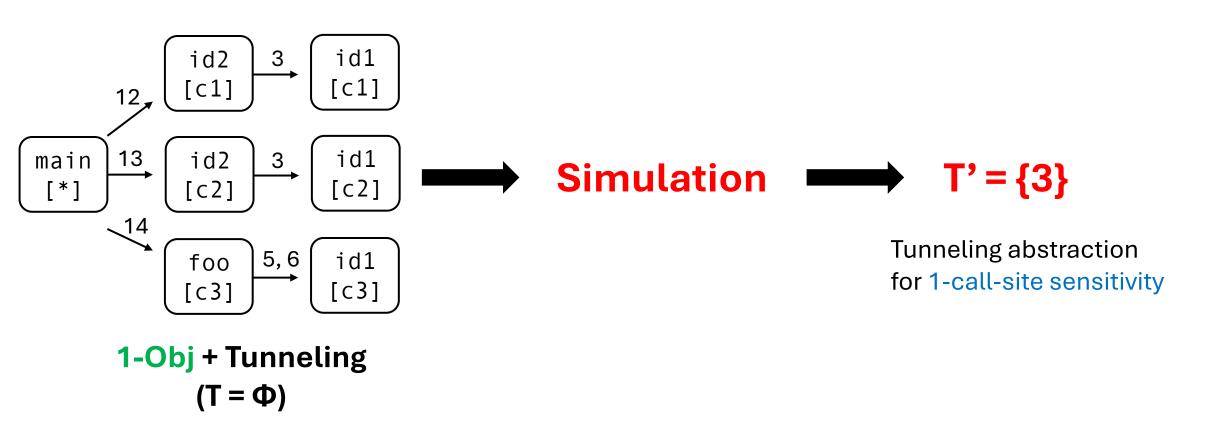
Weakness of object sensitivity

Simulation takes a call-graph and infers a tunneling abstraction

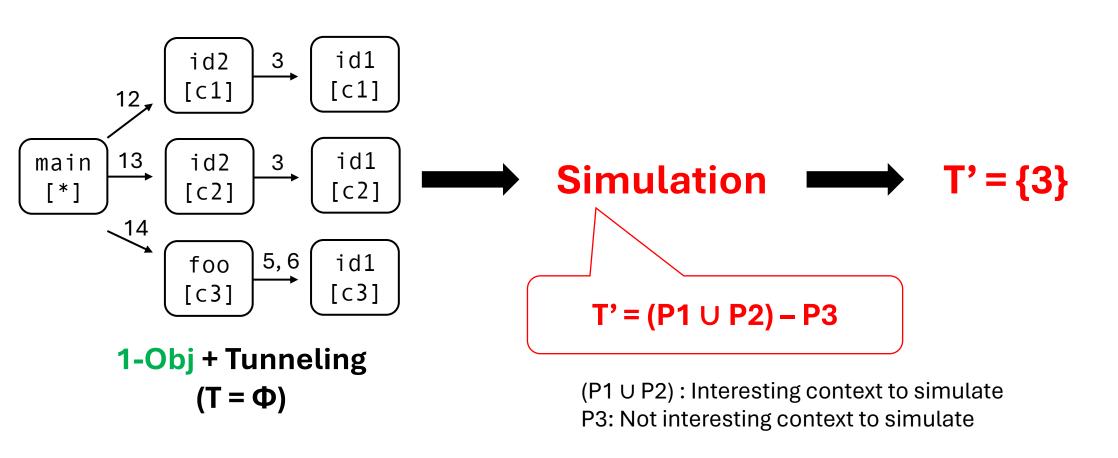
```
1 : class C {
   id1(v) { return v };
   id2(v) { return id1(v)};
4 : foo() {
   A a = (A) this.id1(new A());
6 : B b = (B)this.id1(new B());}
8 : main() {
9 : c1 = new C();
10: c2 = new C();
11: c3 = new C();
12: A a = (A) c1.id2(new A());
13: B b = (B) c2.id2(new B());
    c3.foo();
14:
15: }
```



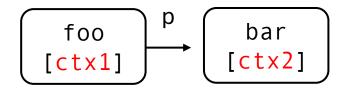
Simulation takes a call-graph and infers a tunneling abstraction



Simulation takes a call-graph and infers a tunneling abstraction



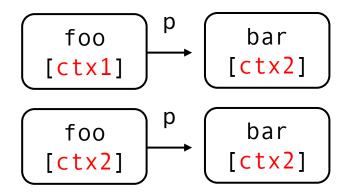
Simulation takes a call-graph and infers a tunneling abstraction



$$T' = (P1 \cup P2) - P3$$

Property 1: caller and callee methods have the same context

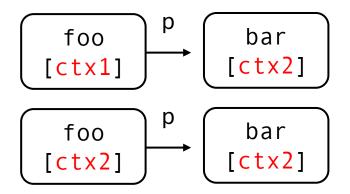
Simulation takes a call-graph and infers a tunneling abstraction



$T' = (P1 \cup P2) - P3$

- Property 1: caller and callee methods have the same context
- Property 2: different caller contexts imply different callee contexts

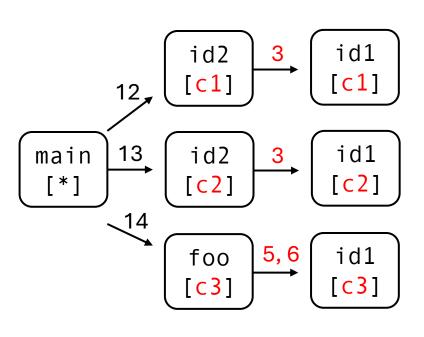
Simulation takes a call-graph and infers a tunneling abstraction



$T' = (P1 \cup P2) - P3$

- Property 1: caller and callee methods have the same context
- Property 2: different caller contexts imply different callee contexts
- Property 3: given object sensitivity produced only one context

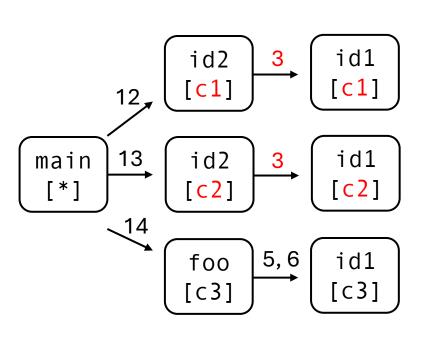
Simulation takes a call-graph and infers a tunneling abstraction



P1: caller and calle methods have the same context
 P1 = {3, 5, 6}

1-Obj + Tunneling
$$(T = Φ)$$

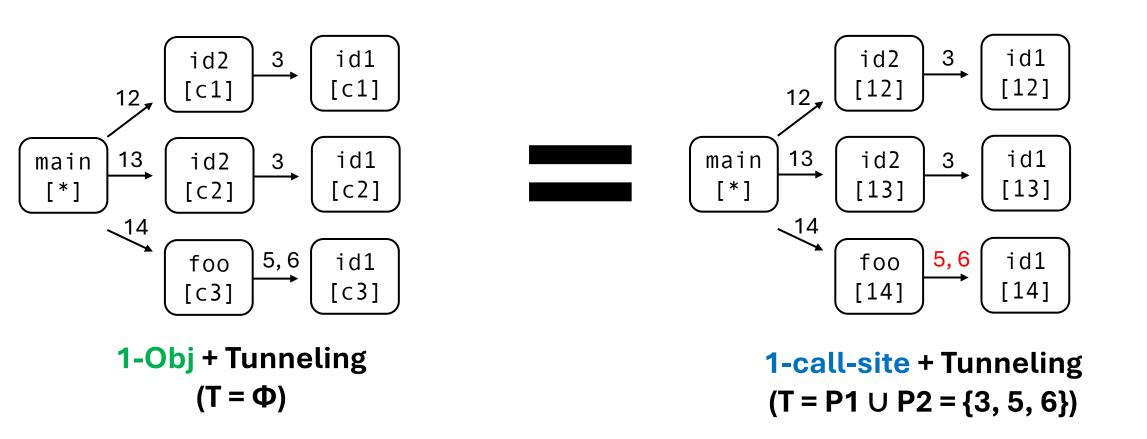
Simulation takes a call-graph and infers a tunneling abstraction



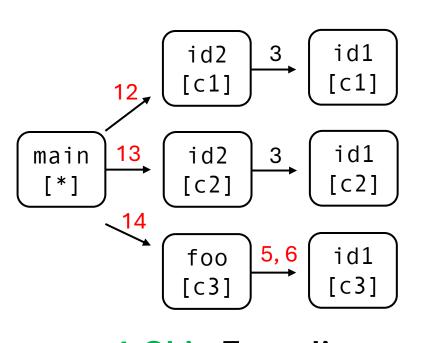
1-Obj + Tunneling

- P1: caller and calle methods have the same context $P1 = \{3, 5, 6\}$
- P2: different caller context imply different callee context
 P2 = {3}

Simulation takes a call-graph and infers a tunneling abstraction



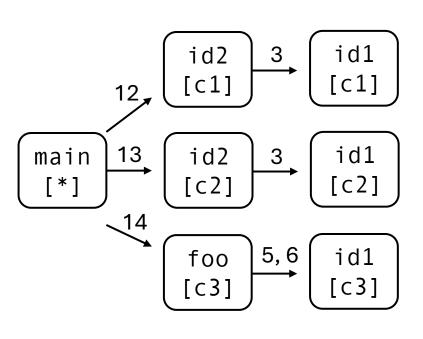
Simulation takes a call-graph and infers a tunneling abstraction



- P1: caller and calle methods have the same context P1 = {3, 5, 6}
- P2: different caller context imply different callee context P2 = {3}
- P3: given object sensitivity produced only one context
 P3 = {5, 6, 12, 13, 14}

1-Obj + Tunneling
$$(T = Φ)$$

Simulation takes a call-graph and infers a tunneling abstraction

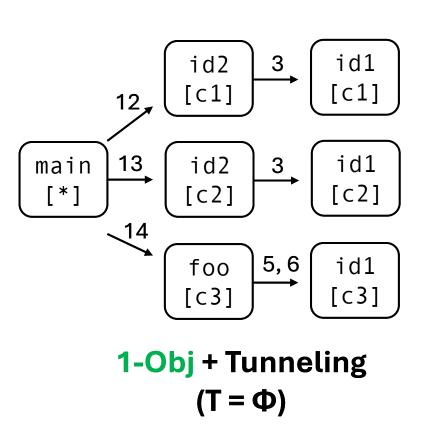


1-Obj + Tunneling
$$(T = Φ)$$

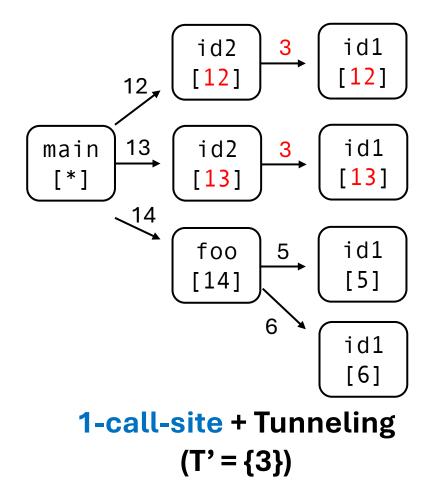
- P1: caller and calle methods have the same context
 P1 = {3, 5, 6}
- P2: different caller context imply different callee context P2 = {3}
- P3: given object sensitivity produced only one context
 P3 = {5, 6, 12, 13, 14}

$$T' = (P1 \cup P2) - P3 = \{3\}$$

Simulation takes a call-graph and infers a tunneling abstraction



→ Simulation →



Obj2CFA – Simulation-guided Learning

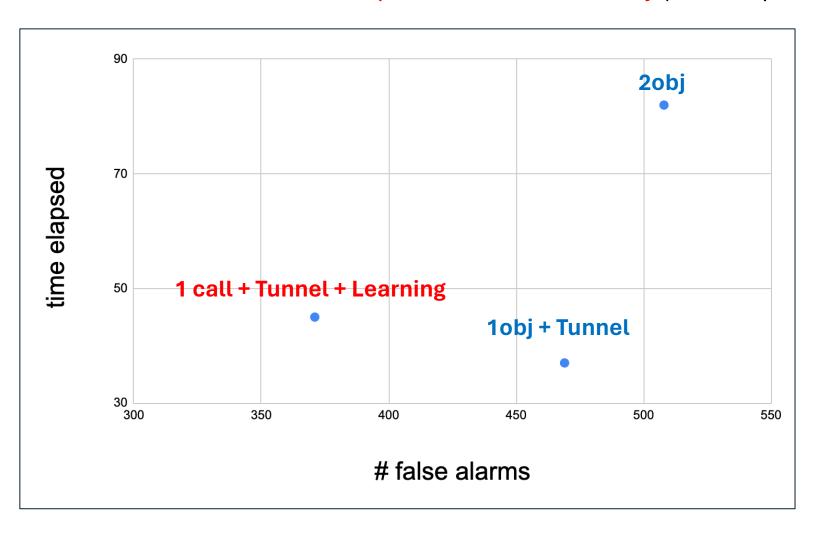
- Simulation is exepnsive
 - simulation requires object sensitivity to obtain call graph
- Learning
 - Given training programs and simulated tunneling abstractions,
 - Find a model that produces similar tunneling abstractions
- The authors modified the features of the context tunneling paper [1]
 to capture the specific simulated behavior

Evaluation

- Doop
 - Pointer analysis framework for JAVA
- Dataset
 - 12 Java programs (10 DaCapo 2006 programs + 2 real-world open source programs)
- Baselines
 - 1-object-sensitive with tunneling [1]
 - 1-call-site sensitivity with tunneling [1]
 - 2-object-sensitive [2]
 - 2-object sensitivity [3]

Results

Obj2CFA outperformed the baselines in terms of precision and scalability (time elapesed)



Summary

- Until recently, call-site sensitivity is known as a worse context than object sensitivity
- However context tunneling can make call-site sensitivity analysis to a good context flavor
- Cotext tunneling can transform object sensitivity to call-site sensitivity
- Cotext tunneling can improve the precision of call-site sensitivity

Appendix: Call-Site Sensitivity vs Object Sensitivity

Object Sensitivity wins!

Parameterized Object Sensitivity for Points-to and Side-Effect Analyses for Java

Ana Milanova Atanas Rountev Barbara G. Ryder
Department of Computer Science
Rutgers University
(milanova, rountev, yder) @cs.rutgers.edu

ABSTRACT

The goal of points-to analysis for Java is to determine the set objects pointed to by a reference oxipide for a reference objet field. Improving the precision of practical points has a wide variety of client applications in optimization base as wide variety of client applications in optimizing compilers and software engineering tools. In this paper we present object sensitivity, as new form of context sensitivity for flow-innessitivity points to analysis for Java. The key idea of our innessitivity of the context of the contex

Side-effect analysis determines the memory locations that may be modified by the execution of a program statement. This information is needed for various compiler optimizations and software engineering tools. We present a new form of side-effect analysis for Java which is based on objectsensitive points-to analysis.

We have implemented one instantiation of our parameterized object-sensitive points-to analysis. We compare this instantiation with a context-ineensitive points-to analysis for Java which is based on Andersen's analysis for C [4]. On a set of 23 Java programs, our experiments show that object-sensitive analysis is actually faster than the context-insensitive analysis. Our results also show that object-ensitive analysis. Our results also show that object-ensitive analysis, our results also show that object-ensitive analysis, our results also show that object-ensitive analysis, our results also show that object-ensitive analyses, and graph construction, and virtual call resolution. These experiments demonstrate that object-sensitive analyses can achieve significantly better precision than context. When the same time remaining efficient and practical.

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1. INTRODUCTION

Points to enalysis is a fundamental static analysis used by optimizing Java compilers and software engineering tools to determine the set of objects whose addresses may be stored in reference variables and reference object fields. These points to sets are typically computed by constructing one or more points-to graphs, which serve as abstractions of the run-time memory states of the analyzed program. (An example of a point-tot graph is shown in Figure 1, which is

discussed in Section 2.1)
Optimizing Jawa compilers can use points-to information to perform various optimizations such as virtual call resolution, removal of numerosary syndromization, and state-button, removal of numerosary syndromization, and state-order to the compiler of the context of software engineering tools for example, defense can analysis in needed for program alicing and data-flow-based polytic glasses and optimization similar for employing these analysis and optimization of the compiler of t

Because of this wide range of applications, it is important to investigate approaches for precise and efficient computation of points to information. The two maps dimensions and context sensitivity. Intuitively, flow-sensitive analyses take into account the flow of control between program points inside a method, and compute separate solutions for these inside as method, and compute separate solutions for these between program points, and therefore can be less precise and more efficient than flow-sensitive analyses. Context-sensitive analyses distinguish between the different contexts under which a method is invoked, and analyze the method not separate the different invocation contexts for a method, which, improves efficiency at the expense of some possible which improves efficiency at the expense of some possible

precision loss.

Recent work [19, 26, 15, 20] has shown that flow- and context-insensitive points-to analysis for Java can be efficient and practical even for large programs, and therefore

Strictly Declarative Specification of Sophisticated Points-to Analyses

Martin Bravenboer Yannis Smaragdakis

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University of Massachusetts, Amherst
Amherst, MA 0 1003, USA
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Abstract

We present the Door framework for points to analysis of Java programs. Door builds on the idea of specifying printer analysis algorithms declaratively, using Datalog: a logicbased language for defining (recursive) relations. We care the declarative approach further than past work by describing the full end-to-end analysis in Datalog and optimizing aggressively using a novel technique specifically targeting highly recursive Datalog programs.

As a result, Door achieves several benefits, including full order of magnitude improvements in mutine. We compare Door with Lhotik and Hendren's Paonat, which defines the state of the art for context-sensivine analyses. For the exects ame logical points-to-definitions (and, consequently, identical precision) Door is more than 15st faster than Paonas for a 1-call-site sensitive analysis of the DoCapo benchmarks, with lower but still substantial speedups for other important analyses. Additionally, Door scales to very precise analyses that are impossible with Paonas and Whatey et al's biddhidt, directly addressing open problems in past literature. Finally, our implementation is modular and can be esily configured to analyses with a wide range of characteristics, largely due to its declarativesses.

Categories and Subject Descriptors F3.2 [Logics and Meanings of Programs]: Semantics of Programming Languages—Program Analysis; D.1.6 [Programming Techniques]: Logic Programming

General Terms Algorithms, Languages, Performance

1. Introduction

Points-to (or pointer) analysis intends to answer the question "what objects can a program variable point to?" This question forms the basis for practically all higher-level program

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OOPSLA 2009. O Scober 25-29, 2009, Ochando, Fariolish, USA.

analyses. It is, thus, not surprising that a wealth of research has been devoted to efficient and precise pointer analysis techniques. Context-sensitive analyses are the most common cleans of precise points to analyses. Context-sensitive analysis and precise the surprise and the common common cleans of precise points to analyses. Context sensitive analysis approaches qualify the analysis facts with a context adstanction, which captures a static notion of the dynamic context of a method. Typical contexts include abstractions of method call-sizes (for a cold-size sensitive analysis—the radiational meaning of "context-sensitive majors," or receiver objects (for an other-sensitive majors).

In this work, we present Door: a general and versaile points to analysis framework that makes feasible the most precise context-sensitive analyses reported in the literature. Door implements a range of algorithms, including context insensitive, call-site sensitive, and object-sensitive analyses, all alspecified modularly as variations on a common code base. Compared to the prior state of the art, Door often achieves speedups of an order-of-magnitude for several important analyses.

The main elements of our approach are the use of the Data.

alog language for specifying the program analyses, and the aggressive optimization of the Datalog program. The use of Datalog for program analysis (both low-level [13,23,29] and high-level [6,9]) is far from new. Our novel optimization ar proach, however, accounts for several orders of magnitude of performance improvement; unoptimized analyses typically run over 1000 times more slowly. Generally our optimiza tions fit well the approach of handling program facts as a database, by specifically targeting the indexing scheme and the incremental evaluation of Datalog implementations. Fur thermore, our approach is entirely Datalog based, encoding declaratively the logic required both for call graph construction as well as for handling the full semantic complexity of the Java language (e.g., static initialization, finalization reference objects, threads, exceptions, reflection, etc.). This makes our pointer analysis specifications elegant, modular but also efficient and easy to tune. Generally, our work is a strong data point in support of declarative languages: we argue that prohibitively much human effort is required for im initions at an operational level of abstraction. On the other



Making Pointer Analysis More Precise by Unleashing the Power of Selective Context Sensitivity

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Traditional context-sensitive pointer analysis is hard to scale for large and complex [was programs. To address this sixue, a series of selective context-sensitivity approaches have been proposed and child promising results In this work, we move one step further towards producing [highly-precise pointer analyses for hard-to-analyse lay ne programs by presenting the this 17-bell asy framework. Which takes selective context sensitivity to the next level. Brethy, this $1/\gamma$ -Relax || x| is one-two punch; given a set of different selective context-sensitivity approaches $y_i \le y_i \le$

As a proof-of-concept, we instantiate Unity-Relay into a tool called Raron and extensively evaluate it on a set of hard-to-analyze Java programs, using general precision entries and popular clients. Compared with the state of the art. Baron achieves the best precision for all metrics and clients for all evaluated programs. The difference in precision is often dramatic—up to 71% of alias pairs reported by previously-best algorithms are found to be spurious and eliminated.

 $\label{eq:CCS} \text{Concepts: } \bullet \textbf{Theory of computation} \rightarrow \textbf{Program analysis}.$

Additional Key Words and Phrases: Pointer Analysis, Alias Analysis, Context Sensitivity, Java

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1 INTRODUCTION

Pointer analysis is important for an array of real-world applications such as bug detection [Chandra et al. 2009, Naike 4 al. 2004, Security analysis [Arzt et al. 2014; Livshits and Lam 2005] program verification [Fink et al. 2008; Pradel et al. 2012] and program understanding [Li et al. 2016; Sridharan

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- [1] Ana Milanova, Atanas Rountev, and Barbara G. Ryder. 2005. Parameterized object sensitivity for points-to analysis for Java. ACM Trans. Softw. Eng. Methodol. 14, 1 (January 2005), 1–41. https://doi.org/10.1145/1044834.1044835
- [2] Martin Bravenboer and Yannis Smaragdakis. 2009. Strictly declarative specification of sophisticated points-to analyses. SIGPLAN Not. 44, 10 (October 2009), 243–262. https://doi.org/10.1145/1639949.1640108
- [3] Tian Tan, Yue Li, Xiaoxing Ma, Chang Xu, and Yannis Smaragdakis. 2021. Making pointer analysis more precise by unleashing the power of selective context sensitivity. Proc. ACM Program. Lang. 5, OOPSLA, Article 147 (October 2021), 27 pages. https://doi.org/10.1145/3485524