

Exception Analysis and Points-to Analysis

Better Together

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what do we do?

precise analysis of exception handling

improve precision and speed of points-to analyses

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precise analysis of exception handling
improve precision and speed of points-to analyses

how do we do it?

fully declarative specification
modular extension



what do we do?

- precise analysis of exception handling
- improve precision and speed of points-to analyses

how do we do it?

- fully declarative specification
- modular extension

why do you care?

- fast, sophisticated, simple
- different



what do we do?

precise analysis of exception handling
improve precision and speed of points-to analyses

how do we do it?

fully declarative specification
modular extension

why do you care?

fast, sophisticated, simple
different

why is it relevant?

major new experimental findings
state-of-the-art points-to analyses



computation of control-flow induced by exceptions

```
void foo() {  
    if(...)  
        throw new FooException();  
}  
  
void mid() {  
    foo();  
}  
  
void bar() {  
    try {  
        foo();  
    }  
    catch(Exception exc) {...}  
}
```

computation of control-flow induced by exceptions

```
void foo() {  
    if(...)   
        throw new FooException();  
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void mid() {  
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void bar() {  
    try {  
        foo();  
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```

- exception-flow induces interprocedural assignments
- exceptions are normal objects
- arbitrary expressions can be thrown

computation of control-flow induced by exceptions

```
void foo() {  
    if(...)   
        throw new FooException();  
}  
  
void mid() {  
    foo();  
}  
  
void bar() {  
    try {  
        foo();  
    }  
    catch(Exception exc) {...}  
}
```

- exception-flow induces interprocedural assignments
- exceptions are normal objects
- arbitrary expressions can be thrown

```
catch(SomeException e) {  
    throw e.getCause();  
}
```

```
throw  
    createSomeException();
```


computation of control-flow induced by exceptions

```
void foo() {  
    if(...)  
        throw new FooException();  
}  
  
void mid() {  
    foo();  
}  
  
void bar() {  
    try {  
        foo();  
    }  
    catch(Exception exc) {...}  
}
```

questions answered:

- what exceptions may foo throw?
- where may the FooException thrown in foo get caught?
- what exceptions may get caught by the handler in bar?

application: program understanding

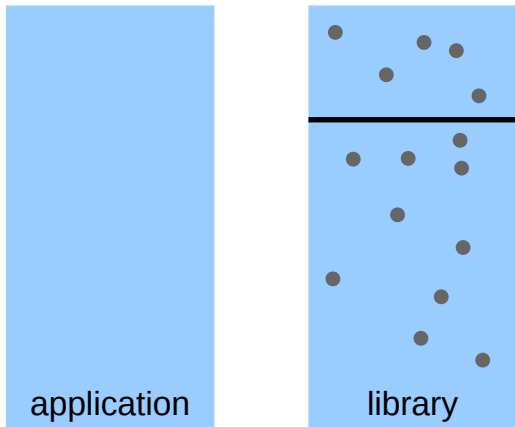
- understand exception-flow in codebases
- coding assistance tool
- also for languages with declared checked exceptions
 - unchecked exceptions
 - `throws`-clause specifies superset
 - e.g. `IOException`

⇒ exception types do not explain where exceptions originate

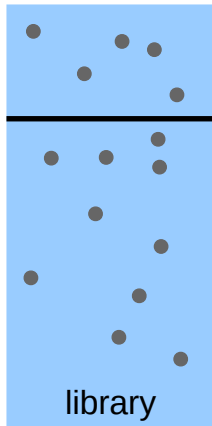
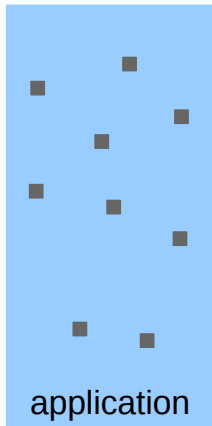
application: test coverage of exceptional situations [Fu et al.]



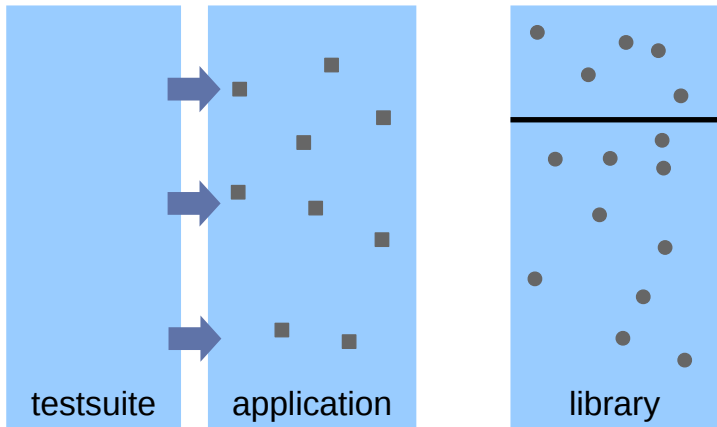
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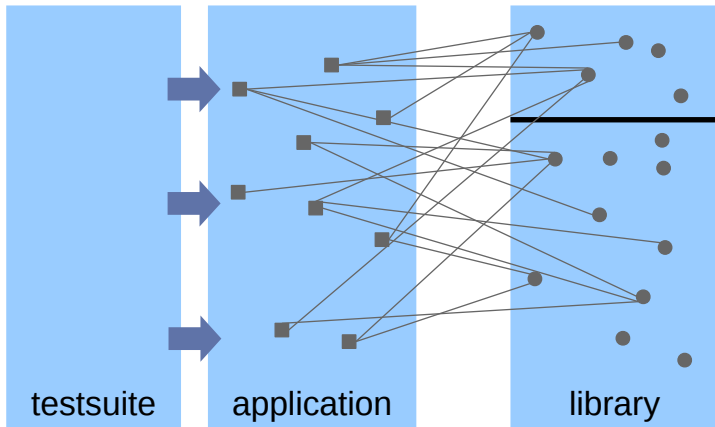
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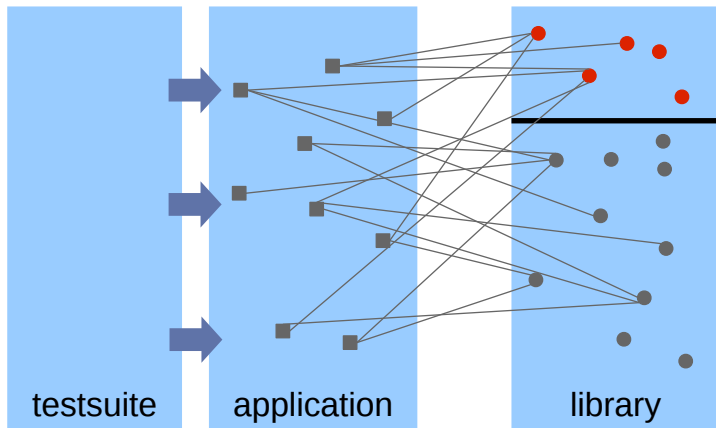
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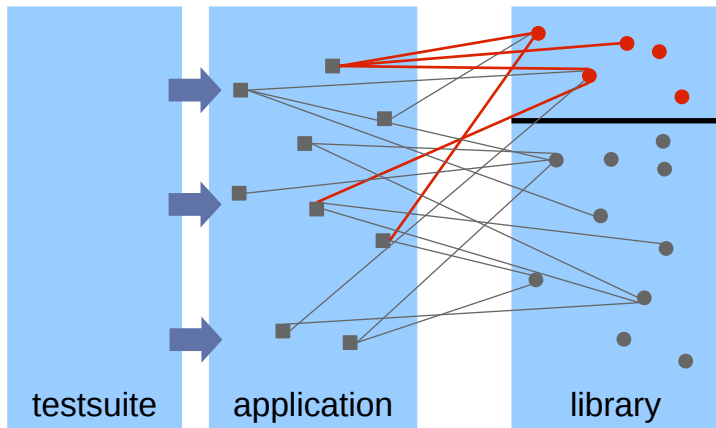
application: test coverage of exceptional situations [Fu et al.]



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application: test coverage of exceptional situations [Fu et al.]



points-to analysis (facilitate other applications)

what objects can a variable point to?

program

```
void foo() {  
    a = new A1();  
    b = id(a);  
}
```

```
void bar() {  
    a = new A2();  
    b = id(a);  
}
```

```
A id(A a) {  
    return a;  
}
```

what objects can a variable point to?

program

```
void foo() {  
  a = new A1();  
  b = id(a);  
}
```

```
void bar() {  
  a = new A2();  
  b = id(a);  
}
```

```
A id(A a) {  
  return a;  
}
```

points-to

foo:a		new A1()
bar:a		new A2()

objects represented
by allocation sites

what objects can a variable point to?

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  a = new A2();  
  b = id(a);  
}
```

```
A id(A a) {  
  return a;  
}
```

points-to

foo:a		new A1()
bar:a		new A2()
id:a		new A1(), new A2()

objects represented
by allocation sites

what objects can a variable point to?

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void bar() {  
  a = new A2();  
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}
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```
A id(A a) {  
  return a;  
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```

points-to

foo:a		new A1()
bar:a		new A2()
id:a		new A1(), new A2()
foo:b		new A1(), new A2()
bar:b		new A1(), new A2()

objects represented
by allocation sites

what objects can a variable point to?

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```
void foo() {
  a = new A1();
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void bar() {
  a = new A2();
  b = id(a);
}
```

```
A id(A a) {
  return a;
}
```

points-to

foo:a	new A1()
bar:a	new A2()
id:a	new A1(), new A2()
foo:b	new A1(), new A2()
bar:b	new A1(), new A2()

objects represented
by allocation sites

context-sensitive points-to

foo:a	new A1()
bar:a	new A2()
id:a (foo)	new A1()
id:a (bar)	new A2()
foo:b	new A1()
bar:b	new A2()

points-to analysis

- necessity: sound points-to analyses need to handle all language constructs
- exception analysis is different, and complicates points-to algorithms

workaround: imprecise exception analysis

```
throw e;           ⇒  THROWN_EXCEPTIONS = e;  
catch(Exception e); ⇒  e = THROWN_EXCEPTIONS;
```

sneak preview: our finding

imprecise exception handling dominates the output of precise context-sensitive points-to analysis

points-to analysis

call graph analysis

exception analysis

points-to analysis

call graph analysis

exception analysis

$x = y$



call graph analysis

exception analysis

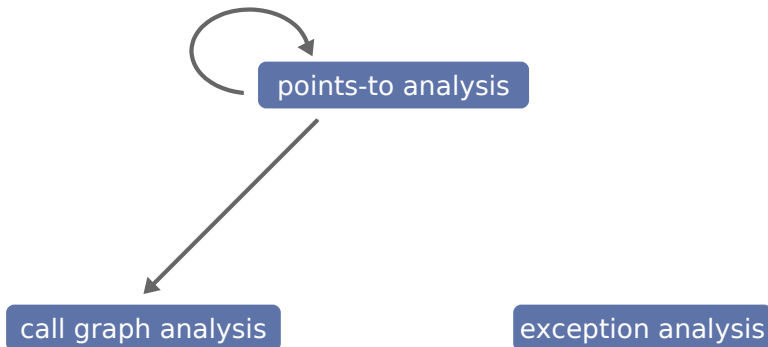
$x = y$



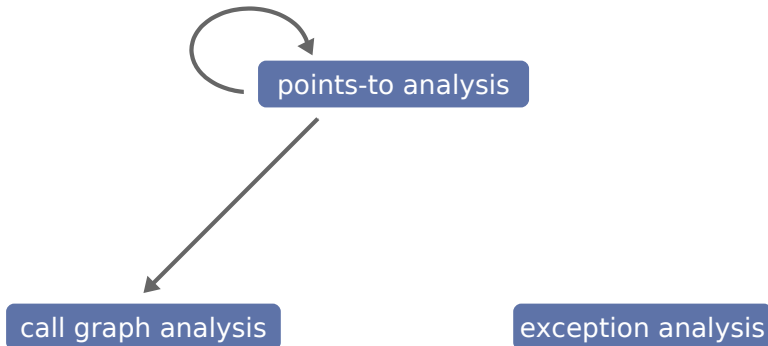
call graph analysis

exception analysis

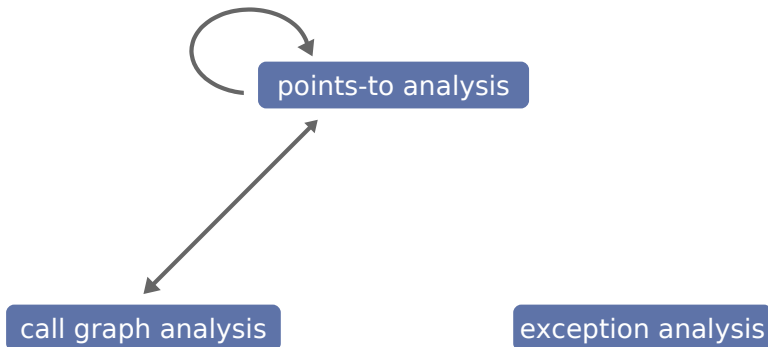
`x = f()`



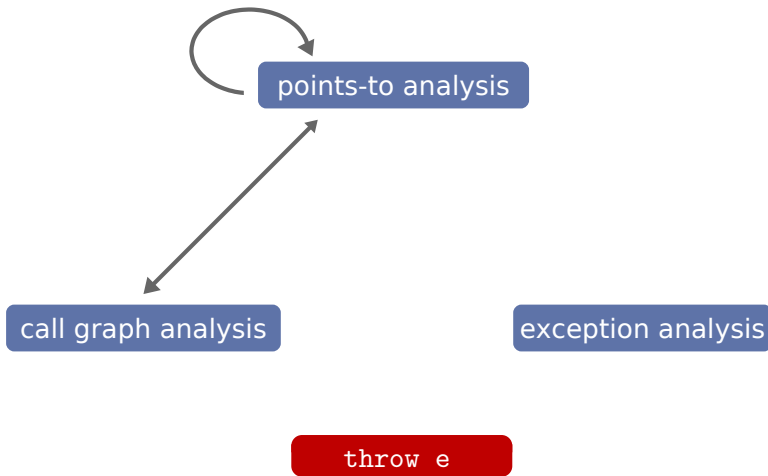
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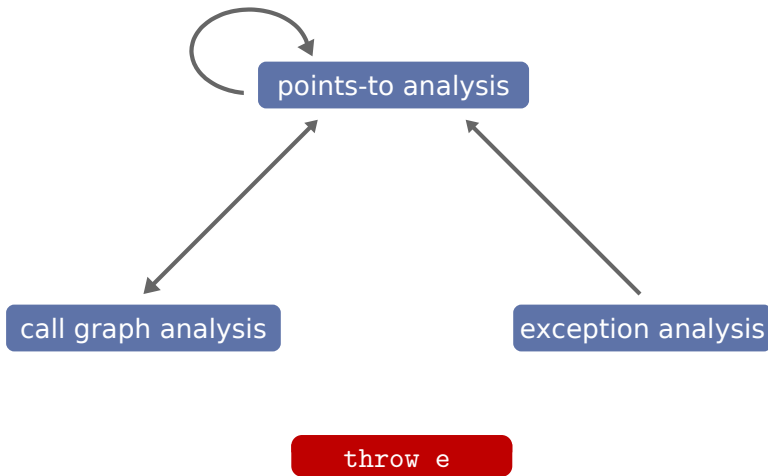


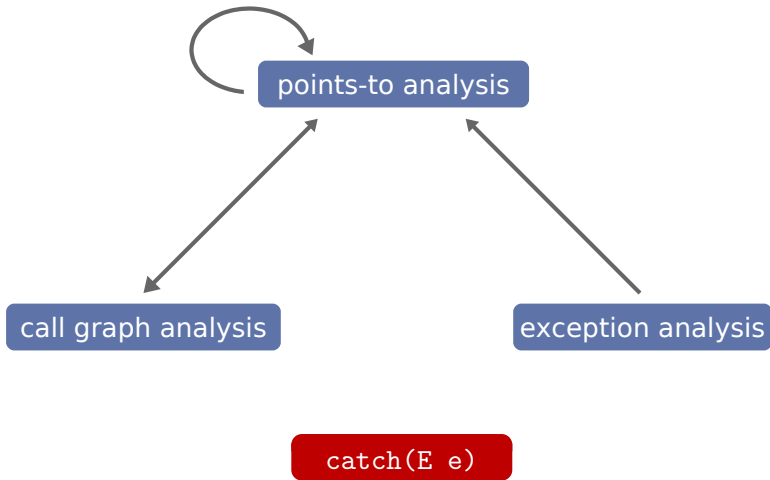
`x = y.f()`

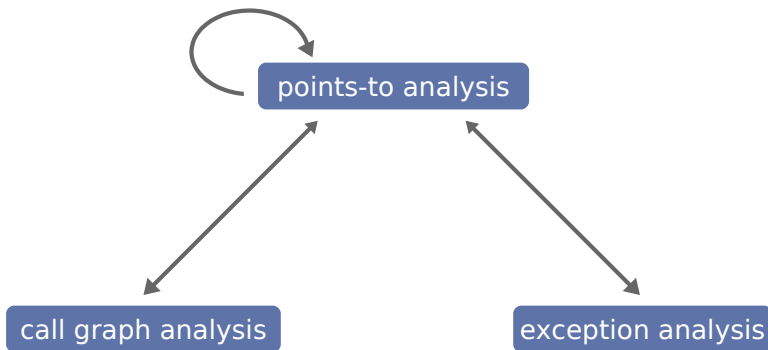


`x = y.f()`

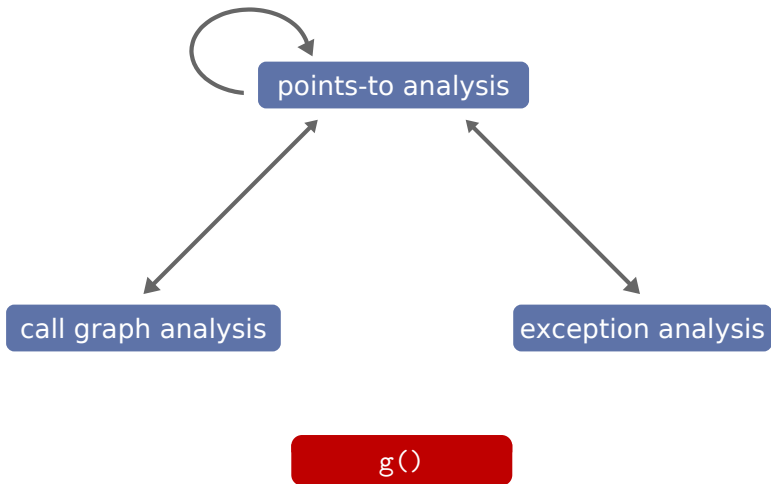


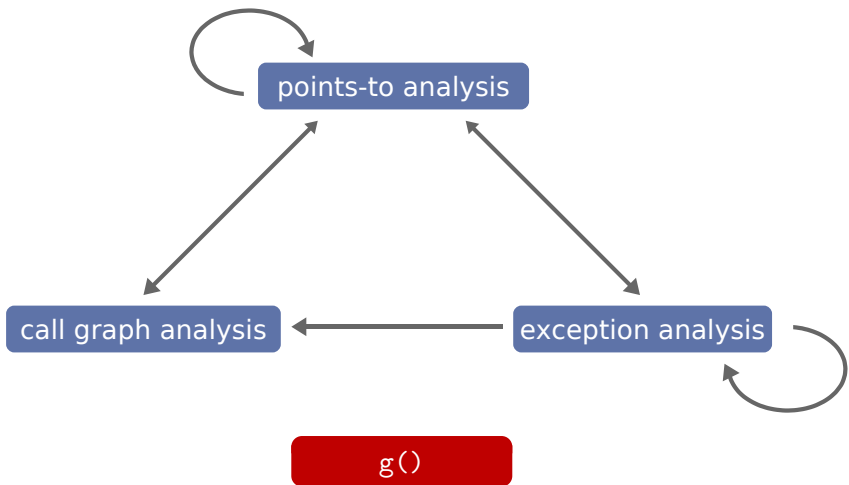


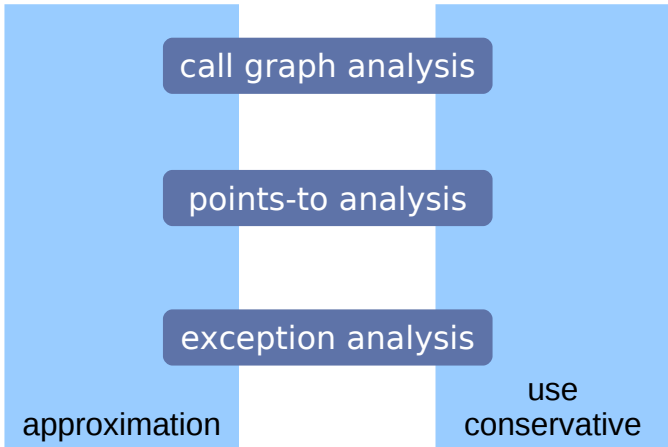


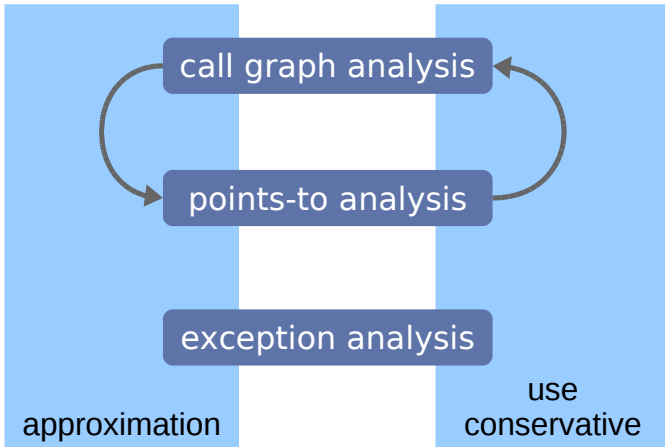


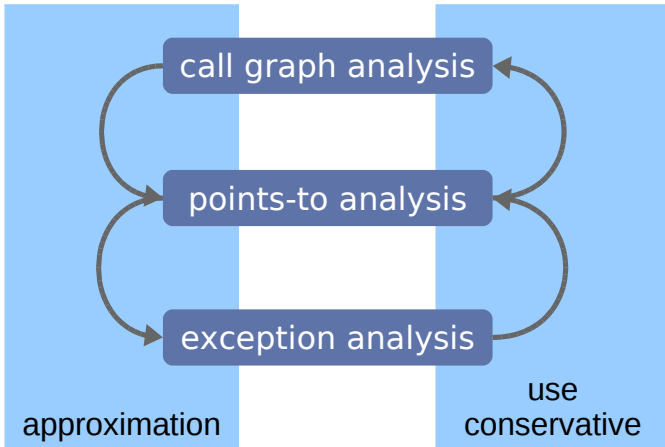
`catch(E e)`

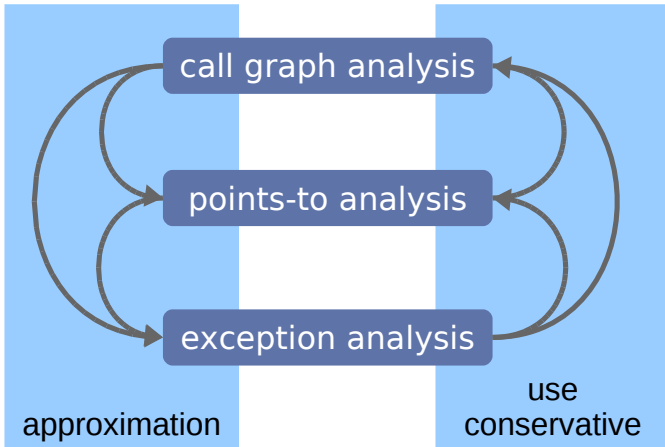


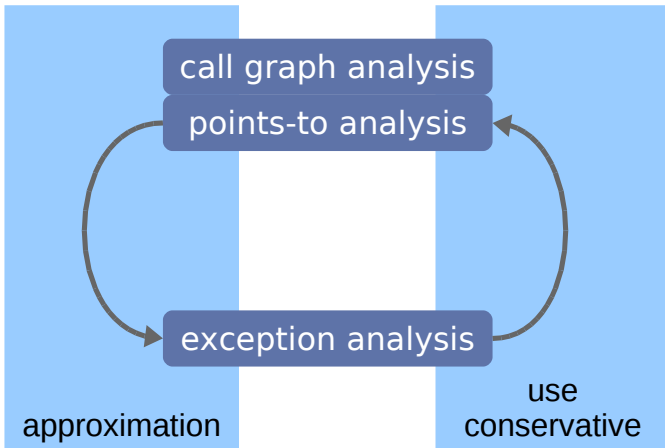


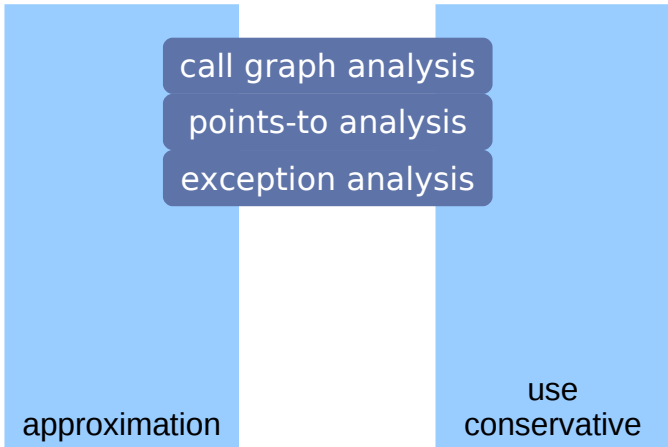












joint exception analysis and points-to analysis

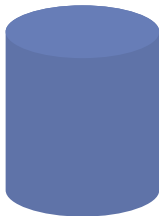
- major improvement in overall precision
- major performance improvement

where is the magic?

- our approach: no imperative algorithm, only declarative specification
- simple declarative specification of highly complex mutually recursive dependencies in datalog

source

```
a = new A();  
b = new B();  
c = new C();  
a = b;  
b = a;  
c = b;
```



source

```
a = new A();  
b = new B();  
c = new C();  
a = b;  
b = a;  
c = b;
```

AssignObjectAllocation

a		new A()
b		new B()
c		new C()

Assign

b		a
a		b
b		c

source

```
a = new A();  
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a = b;  
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```

AssignObjectAllocation

a		new A()
b		new B()
c		new C()

Assign

b		a
a		b
b		c

```
VarPointsTo(?var, ?obj) <-  
  AssignObjectAllocation(?var, ?obj).
```

```
VarPointsTo(?to, ?obj) <-  
  Assign(?from, ?to),  
  VarPointsTo(?from, ?obj).
```

source

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VarPointsTo

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```

AssignObjectAllocation

a	new A()
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Assign

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a	b
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VarPointsTo

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a = b;
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```

AssignObjectAllocation

a	new A()
b	new B()
c	new C()

Assign

b	a
a	b
b	c

VarPointsTo

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c	new C()
a	new B()

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AssignObjectAllocation

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Assign

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VarPointsTo

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a		new B()
b		new A()
c		new B()
c		new A()

```

VarPointsTo(?var, ?obj) <-
  AssignObjectAllocation(?var, ?obj).

```

```

VarPointsTo(?to, ?obj) <-
  Assign(?from, ?to),
  VarPointsTo(?from, ?obj).

```

limited logic programming

- sql with recursion
prolog without complex terms (constructors)
- captures PTIME complexity class

strictly declarative

- as opposed to prolog
 - conjunction commutative
 - rules commutative
- increases optimization opportunities
 - enables different execution strategies
 - enables more aggressive optimization

writing datalog is less programming, more specification

Strictly Declarative Specification of Sophisticated Points-to Analyses

- performance
- scalability
- declarative specification
- no BDDs



<http://doop.program-analysis.org>

method invocations: propagated exceptions

```
void f() {  
    ...  
}
```

method invocations: propagated exceptions

```
void f() {  
    g();  
}
```

method invocations: propagated exceptions

- `ThrowPointsTo(?caller, ?obj) <-`

```
void f() {  
    g();  
}
```

Method declaration `?caller`
may throw exception object
`?obj`

method invocations: propagated exceptions

- `ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),`

```
void f() {  
    g();  
}
```

Method invocation
`?invocation` may invoke
method `?tomethod`

method invocations: propagated exceptions

- `ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),`

```
void f() {  
    g();  
}
```

Method declaration `?tomethod`
may throw exception object
`?obj`

method invocations: propagated exceptions

- ```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
```

```
void f() {
 g();
}
```

The type of the object allocated  
at ?obj is ?objtype

**method invocations: propagated exceptions**

ThrowPointsTo(?caller, ?obj) <-  
  CallGraphEdge(?invocation, ?tomethod),  
  ThrowPointsTo(?tomethod, ?obj),  
  Object:Type[?obj] = ?objtype,  
  not exists ExceptionHandler[?objtype, ?invocation],

```
void f() {
 g();
}
```

Exceptions of specific type  
?objtype, thrown at instruction  
?invocation, are handled by  
exception handler ?handler

**method invocations: propagated exceptions**

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

Instruction ?invocation is  
in method ?caller

**method invocations: propagated exceptions**

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

**method invocations: caught exceptions**

```
void f() {
 try {...}
 catch(E e) {...}
}
```

**method invocations: propagated exceptions**

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

**method invocations: caught exceptions**

```
void f() {
 try { g(); }
 catch(E e) {...}
}
```

**method invocations: propagated exceptions**

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

**method invocations: caught exceptions**

● 

```
VarPointsTo(?param, ?obj) <-
```

```
void f() {
 try { g(); }
 catch(E e) {...}
}
```

### method invocations: propagated exceptions

```
ThrowPointsTo(?caller, ?obj) <-
● CallGraphEdge(?invocation, ?tomethod),
● ThrowPointsTo(?tomethod, ?obj),
● Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

### method invocations: caught exceptions

```
VarPointsTo(?param, ?obj) <-
● CallGraphEdge(?invocation, ?tomethod),
● ThrowPointsTo(?tomethod, ?obj),
● Type[?obj] = ?objtype,
```

```
void f() {
 try { g(); }
 catch(E e) {...}
}
```



## method invocations: propagated exceptions

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

## method invocations: caught exceptions

```
VarPointsTo(?param, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Type[?obj] = ?objtype,
 ExceptionHandler[?objtype, ?invocation] = ?handler,
```

```
void f() {
 try { g(); }
 catch(E e) {...}
}
```

**method invocations: propagated exceptions**

```
ThrowPointsTo(?caller, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Object:Type[?obj] = ?objtype,
 not exists ExceptionHandler[?objtype, ?invocation],
 Instruction:Method[?invocation] = ?caller.
```

```
void f() {
 g();
}
```

**method invocations: caught exceptions**

```
VarPointsTo(?param, ?obj) <-
 CallGraphEdge(?invocation, ?tomethod),
 ThrowPointsTo(?tomethod, ?obj),
 Type[?obj] = ?objtype,
 ExceptionHandler[?objtype, ?invocation] = ?handler,
 ExceptionHandler:FormalParam[?handler] = ?param.
```

```
void f() {
 try { g(); }
 catch(E e) {...}
}
```

## what did you just see here?

- modular extension of variety of base points-to analyses
- approximation only comes from points-to abstraction – exception logic as precise as possible!
- complex mutually recursive dependencies
- specified elegantly in a few lines of logic

you might wonder ... does that work?!

**experimental findings**

statistics highlights for **object sensitive** analysis:

- precision of points-to results

context-insensitive: imprecise  $>$  precise  $\times 1.9$

context-sensitive: imprecise  $>$  precise  $\times 3$

- size of call graph

context-insensitive: no significant difference

context-sensitive:  $1.9\times$  to  $6.1\times$  more edges

- performance

imprecise  $14\times$ ,  $12\times$ ,  $5-10\times$ ,  $1.8\times$  slower

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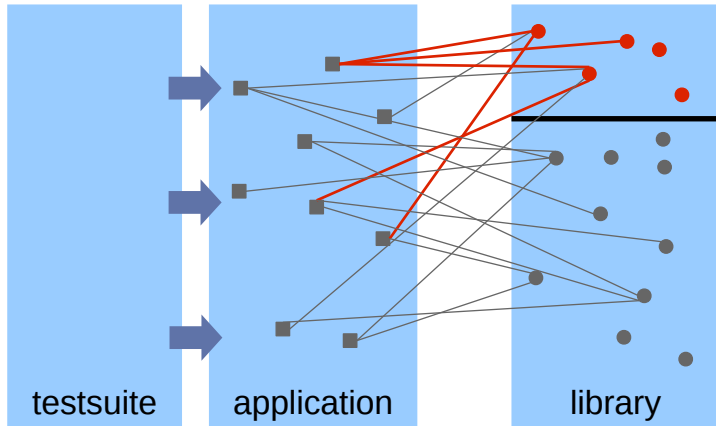
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### our finding

*Precise exception handling has a major impact on the precision and performance of context-sensitive points-to analyses. With imprecise exception handling, the size of the problem is largely determined by exceptions.*

application: test coverage of exceptional situations [Fu et al.]



## test coverage: possible exception-catch links [Fu et al.]

|           |        |        | I/O <sub>sel</sub> | time |
|-----------|--------|--------|--------------------|------|
| imprecise | ftpd   | insens | 104                | 12s  |
|           |        | 1 obj  | 91                 | 23s  |
|           | muffin | insens | 490                | 22s  |
|           |        | 1 obj  | 420                | 86s  |
| precise   | ftpd   | insens |                    |      |
|           |        | 1 obj  |                    |      |
|           | muffin | insens |                    |      |
|           |        | 1 obj  |                    |      |



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| precise   | ftpd   | insens | 47                 | 15s  |
|           |        | 1 obj  | 15                 | 15s  |
|           | muffin | insens | 237                | 31s  |
|           |        | 1 obj  | 49                 | 94s  |

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## our finding

Our **general** joint points-to and exception analysis achieves precision comparable to a **custom** exception-flow analysis, but runs much faster.

## selectively remove features from fully precise analysis

- order of exception handlers not considered (o)

```
catch(FileNotFoundException e) {...}
catch(IOException e) {...}
```

- no filtering of caught exceptions (f)

```
void foo() {
 try {...}
 catch(IOException e) {...}
}
```

- context-insensitive throw points-to (cs)
  - methods throw same exceptions in all contexts

| cs o f | call graph edges | var points-to | throw points-to |
|--------|------------------|---------------|-----------------|
| x x x  | 1.0M             | 598K          | 579K            |
|        |                  |               |                 |
|        |                  |               |                 |
|        |                  |               |                 |
|        |                  |               |                 |

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|----|---|---|------------------|---------------|-----------------|
| x  | x | x | 1.0M             | 598K          | 579K            |
| x  |   | x | ×1.5             | ×1.0          | ×1.1            |
|    |   |   |                  |               |                 |
|    |   |   |                  |               |                 |
|    |   |   |                  |               |                 |

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| ×  | × |   | ×2.6             | ×1.2          | ×1.9            |
|    |   |   |                  |               |                 |
|    |   |   |                  |               |                 |
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| ×  | × |   | ×2.6             | ×1.2          | ×1.9            |
| ×  |   |   | ×2.6             | ×1.3          | ×1.9            |
|    |   |   |                  |               |                 |
|    |   |   |                  |               |                 |
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|    | × | × | ×1.1             | ×1.1          | ×1.9            |
|    |   |   |                  |               |                 |
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|    | × | × | ×1.1             | ×1.1          | ×1.9            |
|    |   | × | ×1.6             | ×1.2          | ×2.1            |
|    | × |   | ×2.7             | ×1.4          | ×3.4            |
|    |   |   | ×2.7             | ×1.5          | ×3.4            |
|    |   |   |                  |               |                 |

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### our finding

*Every approximation of exception handling significantly increases var points-to, throw points-to, or call graph edges.*

## points-to analysis

Precise exception handling has a major impact on the precision and performance of context-sensitive points-to analyses.

## exception-flow analysis

Our *general* joint points-to and exception analysis achieves precision comparable to a *custom* exception-flow analysis, but runs much faster.

## approximations

Every approximation of exception handling significantly increases var points-to, throw points-to, or call graph edges.

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- do not determine where an exception comes from
- conservative/unsound for 'computed' exceptions

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**doop compared to other datalog-based points-to analysis**

- full end-to-end analysis in datalog
- first precise declarative exception analysis

**what have we seen?**

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### what more is in the paper?

- computing exception handlers
- experiments
- background on datalog and points-to analysis