

Practical Abstract Interpretation with LiSA

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Abstract Interpretation Overview

Given P we want to compute properties over its **undecidable** semantics

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$$P(\mathcal{D})$$

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$$P(\mathcal{D}) \xrightarrow{\text{undecidable}} \mathcal{S}$$

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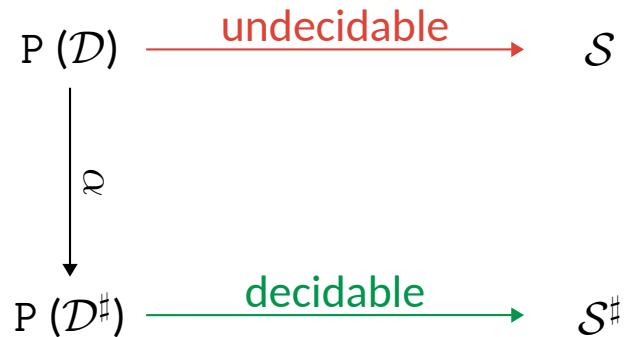
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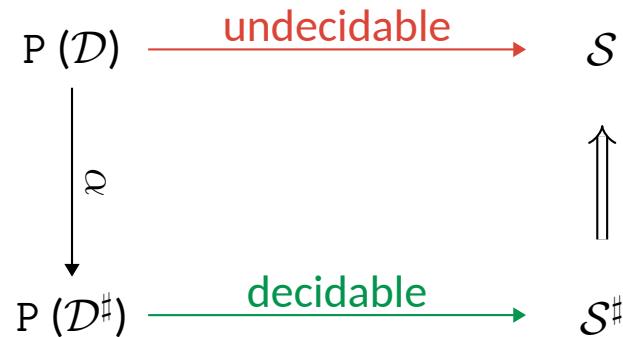
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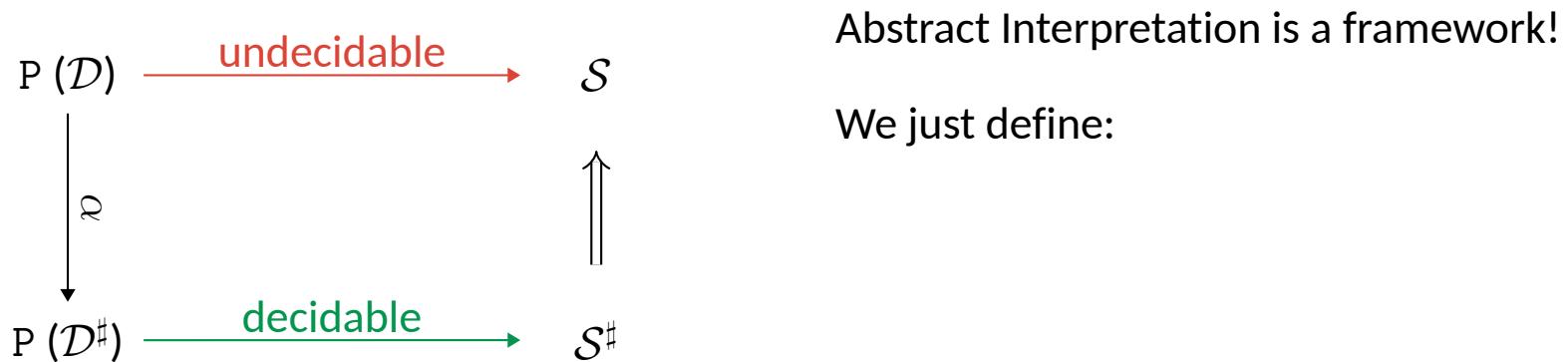
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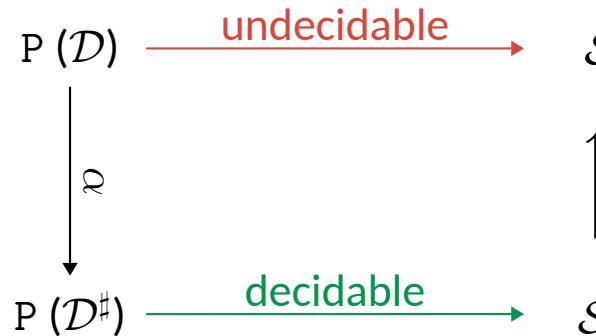
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Abstract Interpretation is a framework!

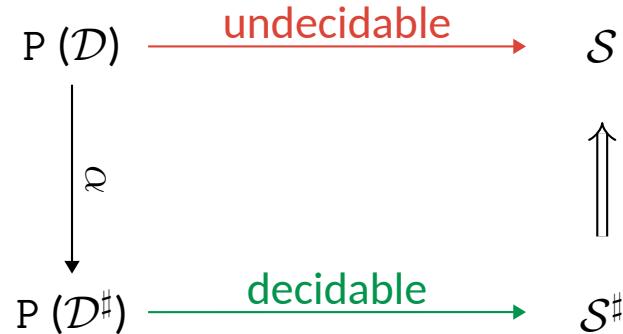
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▷ a set of elements \mathcal{D}^\sharp

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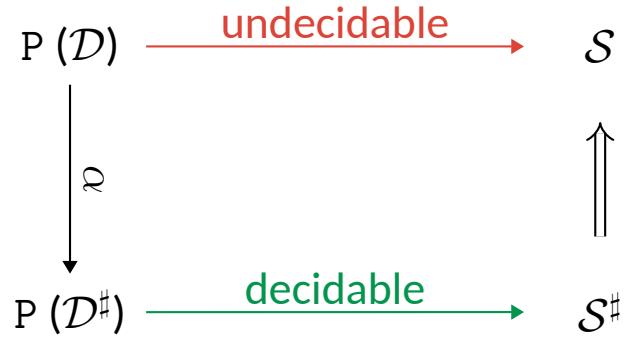
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Abstract Interpretation is a framework!

We just define:

- ▷ a set of elements $D^\#$
- ▷ operators $\sqsubseteq, \sqcup, \sqcap, \nabla, \Delta$ over $D^\#$
- ▷ transformers $S^\#[\cdot], E^\#[\cdot], C^\#[\cdot]$ over $D^\#$

Applying Abstract Interpretation

You can apply \mathcal{D}^\sharp to compute **program invariants**!

For instance, using $\mathcal{D}^\sharp = \text{INTV}$:

```
1 ℓ₀N = int(input())
2 ℓ₁x = 0
3 ℓ₂while ℓ₃x < N:
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We must update ℓ_3 !

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We must keep updating ℓ_3 !

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1  $\ell_0$ N = int(input())
2  $\ell_1$ x = 0
3  $\ell_2$ while  $\ell_3$ x < N:
4      $\ell_4$ x += 1 $\ell_5$ 
5  $\ell_6$ print(x) $\ell_7$ 
```

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We must keep updating ℓ_3 with ∇ !

**How do we put
this in practice?**

Today's Plan

1. Components of a Static Analyzer

2. LiSA: a Library for Static Analysis

3. LiSA's High-Level Architecture

 3.1 Call resolution and evaluation

 3.2 Statement rewriting

 3.3 Memory and Value abstractions

4. Putting it Into Code

 4.1 The Signs Domain

 4.2 The Intervals Domain

 4.3 The Upper Bounds Domain

 4.4 The Pentagons Domain

 4.5 Information flow: the Taint analysis

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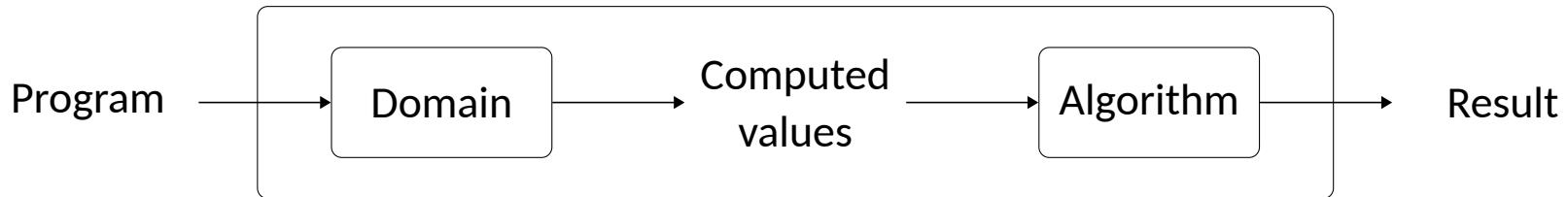
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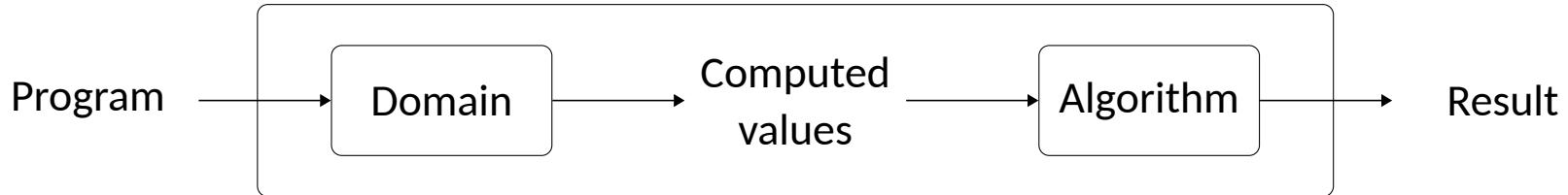
From Theory to Practice



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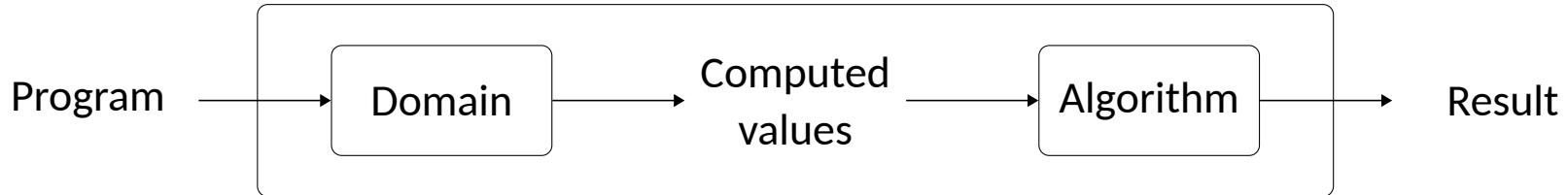
From Theory to Practice



$$y = (2 * 2) - 4$$

$$z = 1 / y$$

From Theory to Practice



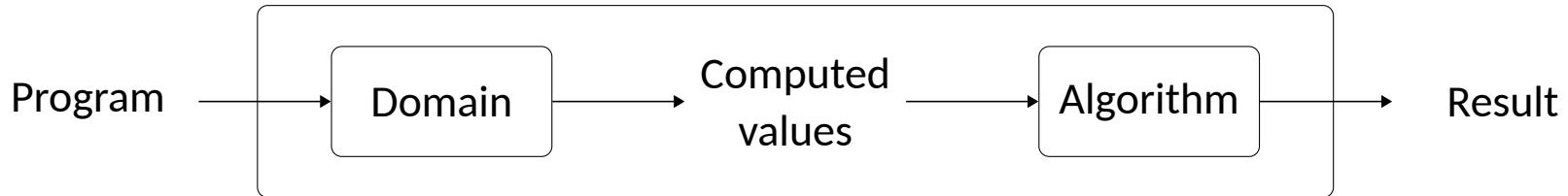
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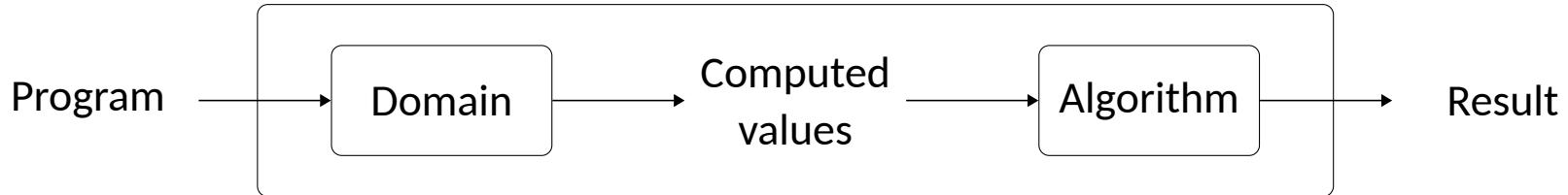
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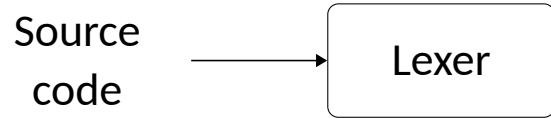
↑
how do we
parse the code?

A (Simplified) Compiler/Interpreter

Source
code

`x = y + 2`

A (Simplified) Compiler/Interpreter



x = y + 2

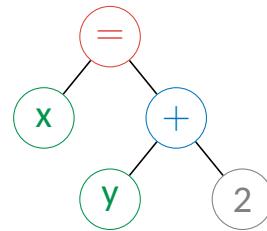
ID EQ ID
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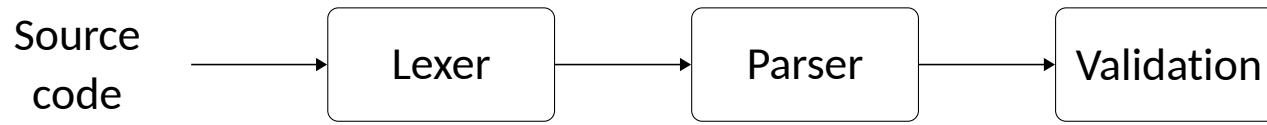


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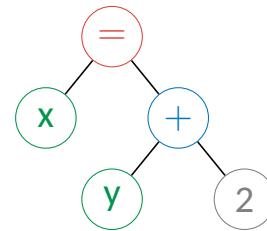


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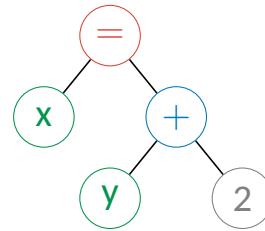
type check,
duplicate functions,
...

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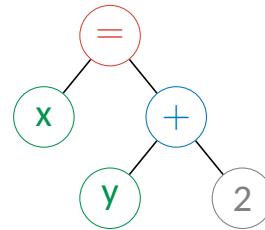
compile/
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simplify and
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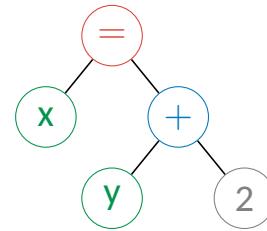
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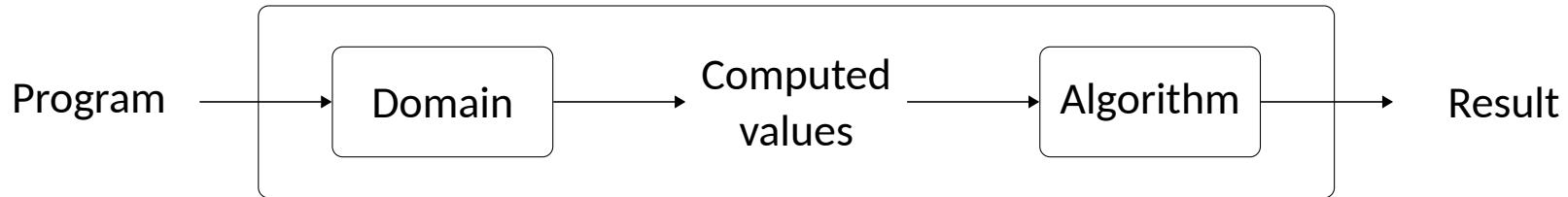
...

simplify and
instrument

compile/
execute

run domains
and algorithms

From Theory to Practice



$y = (2 * 2) - 4$

$z = 1 / y$

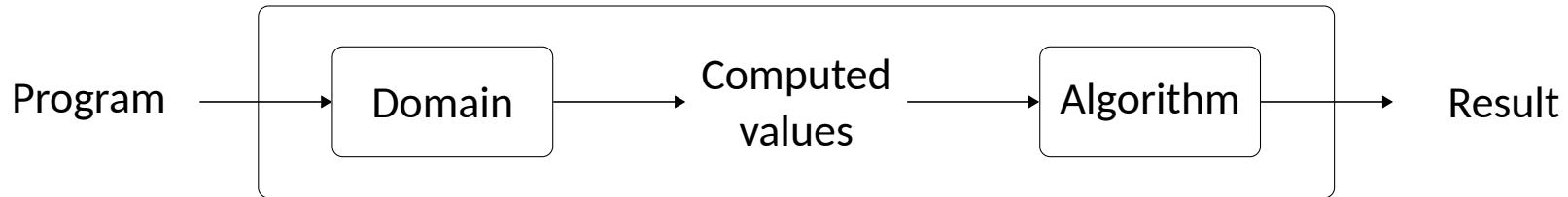
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how do we run
the domain?

Running Fixpoints

- ▷ Solving a system of equations [CC92]

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2 ℓ₁x = 0
3 ℓ₂while ℓ₃x < N:
4     ℓ₄x += 1ℓ₅
5 ℓ₆print(x)ℓ₇
```

\mathcal{X}_i is state reaching ℓ_i :

$$\begin{cases} \mathcal{X}_0 = \mathcal{I} \\ \mathcal{X}_2 = \mathbb{S}^\sharp[\![x = 0]\!] \mathcal{X}_1 \\ \mathcal{X}_4 = \mathbb{S}^\sharp[\![x < N]\!] \mathcal{X}_3 \\ \mathcal{X}_6 = \mathbb{S}^\sharp[\![\text{not } x < N]\!] \mathcal{X}_2 \end{cases} \quad \begin{array}{ll} \mathcal{X}_1 = \mathbb{S}^\sharp[\![N = \text{int}(\text{input}())]\!] \mathcal{X}_0 & \\ \mathcal{X}_3 = \mathcal{X}_2 \nabla^n \mathcal{X}_5 & \\ \mathcal{X}_5 = \mathbb{S}^\sharp[\![x += 1]\!] \mathcal{X}_4 & \\ \mathcal{X}_7 = \mathbb{S}^\sharp[\![\text{print}(x)]\!] \mathcal{X}_6 & \end{array}$$

Running Fixpoints

- ▷ Using inductive abstract interpreter [Cou21]

$$\mathbb{S}^\sharp[P \triangleq st;] \mathcal{X} \triangleq \mathbb{S}^\sharp[st] \mathcal{X}$$

$$\mathbb{S}^\sharp[x = e] \mathcal{X} \triangleq \text{assign}[x = e] \mathcal{X}$$

$$\mathbb{S}^\sharp[st_1; st_2] \mathcal{X} \triangleq \mathbb{S}^\sharp[st_2](\mathbb{S}^\sharp[st_1] \mathcal{X})$$

$$\mathbb{S}^\sharp[\text{if } b \text{ then } st_1 \text{ else } st_2] \mathcal{X} \triangleq \mathbb{S}^\sharp[st_1](\text{assume}[b] \mathcal{X}) \sqcup \mathbb{S}^\sharp[st_2](\text{assume}[\text{not } b] \mathcal{X})$$

$$\mathbb{S}^\sharp[\text{while } b \text{ do } st] \mathcal{X} \triangleq \text{assume}[\text{not } b] \text{lfp}_F \text{ (using } \nabla^n)$$

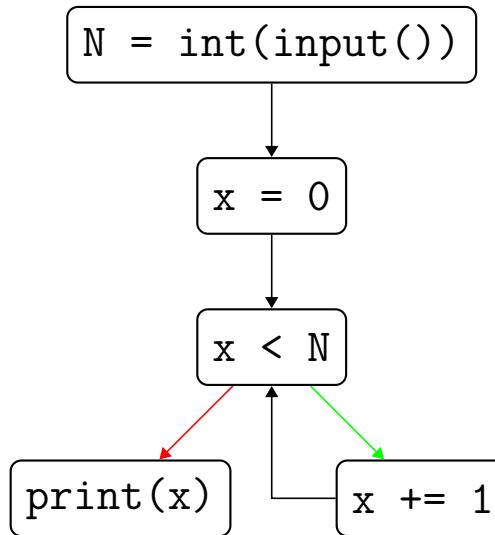
$$\text{where } F(\mathcal{Y}) \triangleq \mathcal{X} \sqcup \mathbb{S}^\sharp[st](\text{assume}[b] \mathcal{Y})$$

...

Running Fixpoints

- ▷ Worklist fixpoint over a CFG [CC77]

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From Theory to Practice



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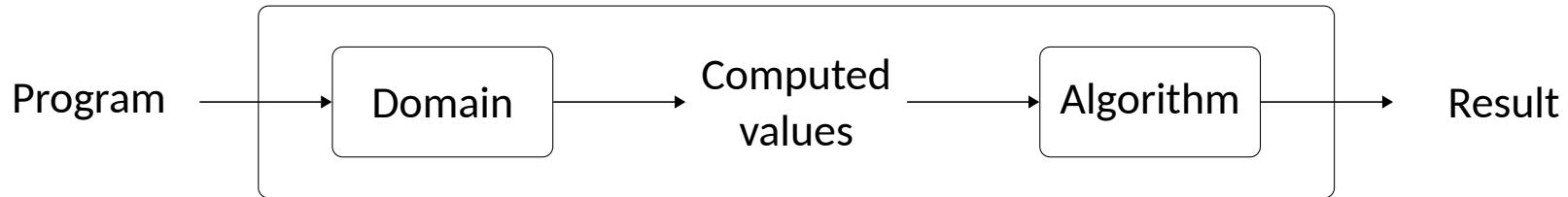
constant
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check for div
by zero

message to
the user

From Theory to Practice



$y = (2 * 2) - 4$
 $z = 1 / \text{obj.f}$

constant
propagation

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 $z \mapsto ??$

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message to
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how do we track
dynamic memory?

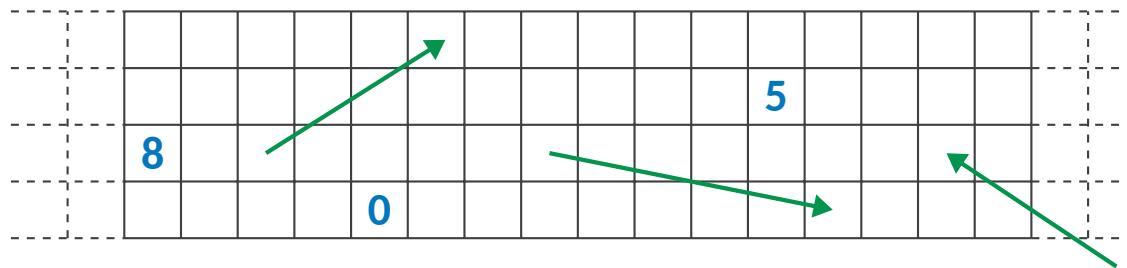
Abstracting Dynamic Memory

Analyzing memory means tracking which cells **contain values** and which ones **refer to other cells**



Abstracting Dynamic Memory

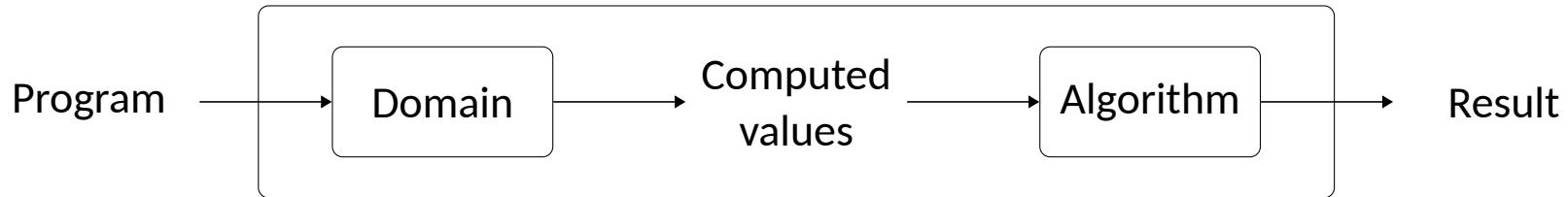
Analyzing memory means tracking which cells **contain values** and which ones **refer to other cells**



Variables are finite in number, (allocated) memory cells **might not be**

Usually, memory domains focus on **shape approximations** or **specific properties** [Hin01, KK16]

From Theory to Practice



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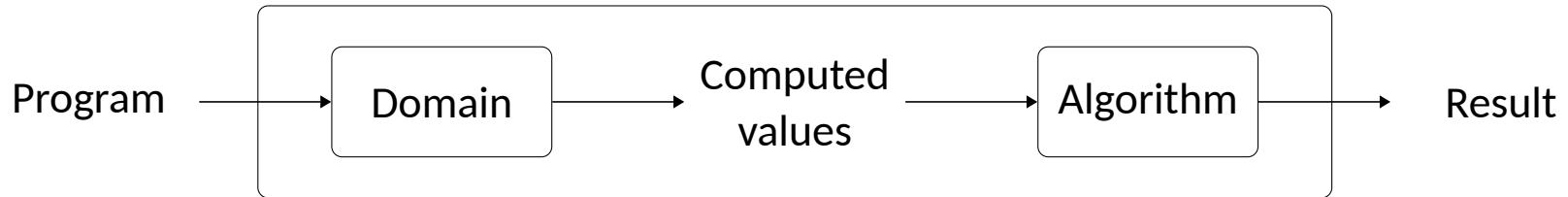
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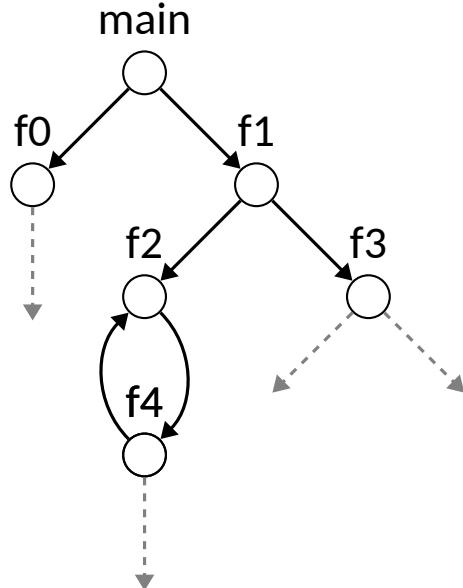
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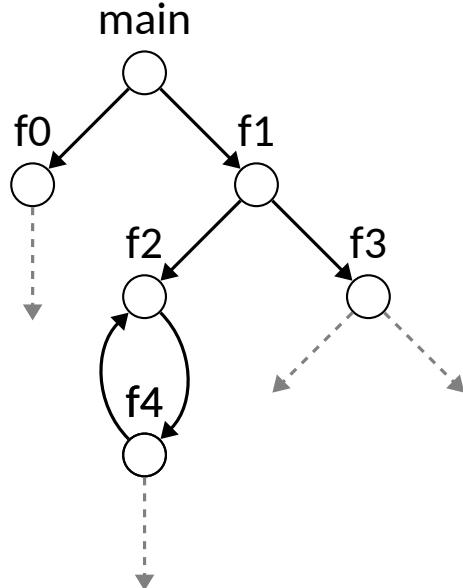
how do we handle
calls and functions?

Abstracting Calls



Abstracting calls means modeling the [call graph](#) of the program

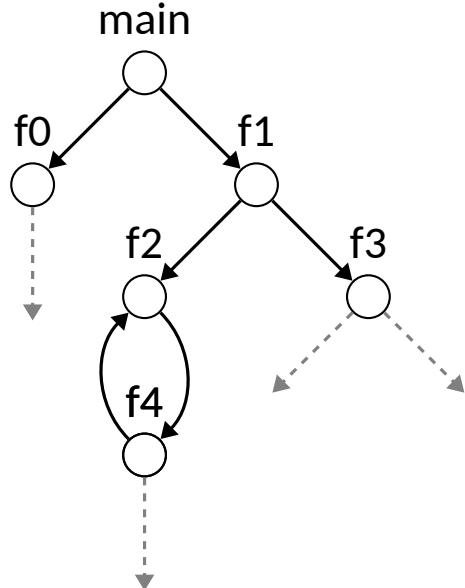
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Solving calls is language-specific, but it generally requires typing information
[DGC95, BS96, GDDC97]

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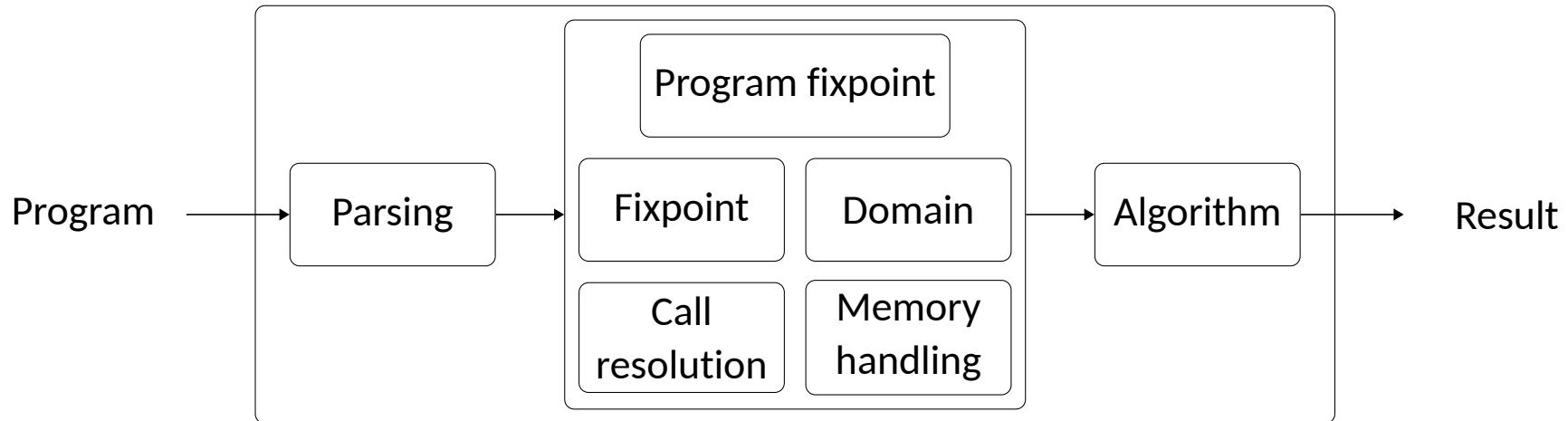
Solving calls is language-specific, but it generally requires typing information

[DGC95, BS96, GDDC97]

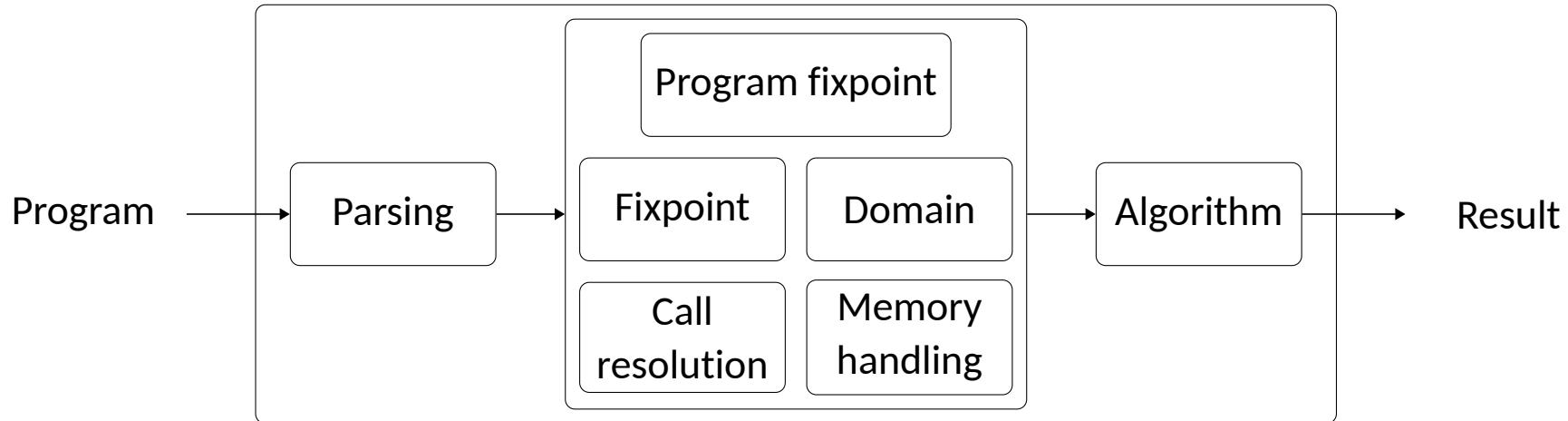
Call evaluation is highly dependent on how we run the overall analysis [PS81]:

- following call chains
- bottom-up
- ...

A Realistic Analyzer's Structure



A Realistic Analyzer's Structure



Different ways to implement this!

Mainly a trade-off between efficiency and reusability

Today's Plan

1. Components of a Static Analyzer

2. LiSA: a Library for Static Analysis

3. LiSA's High-Level Architecture

 3.1 Call resolution and evaluation

 3.2 Statement rewriting

 3.3 Memory and Value abstractions

4. Putting it Into Code

 4.1 The Signs Domain

 4.2 The Intervals Domain

 4.3 The Upper Bounds Domain

 4.4 The Pentagons Domain

 4.5 Information flow: the Taint analysis

LiSA, a Library for Static Analysis



Library for creating static analyzers based on abstract interpretation [NFAC23, Neg23]

- For multiple programming languages
- For a variety of different domains

Purposes:

- Experiment with modular implementations
- Be easy to pick-up (simple, close to formalization)
- Fast prototyping of analyzers and domains

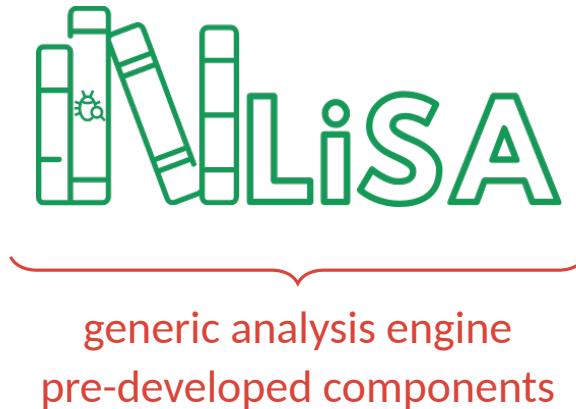
Open source Java library

Created and maintained by the SSV group @ Ca' Foscari

LiSA is...

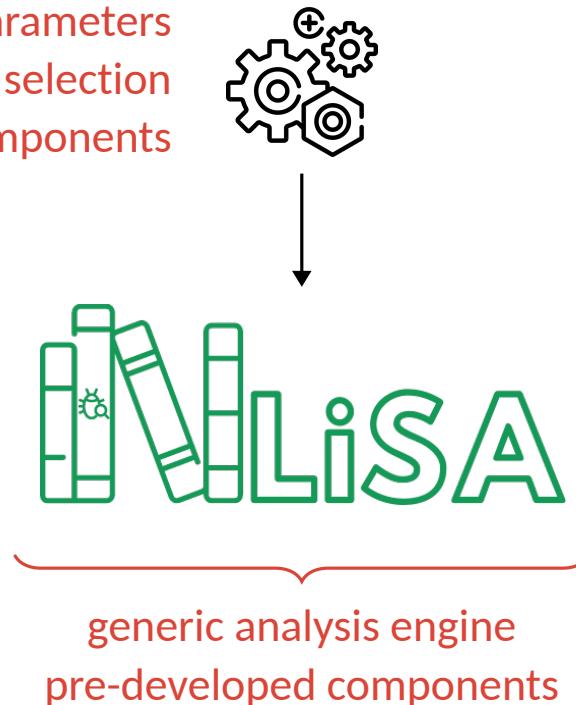


LiSA is...



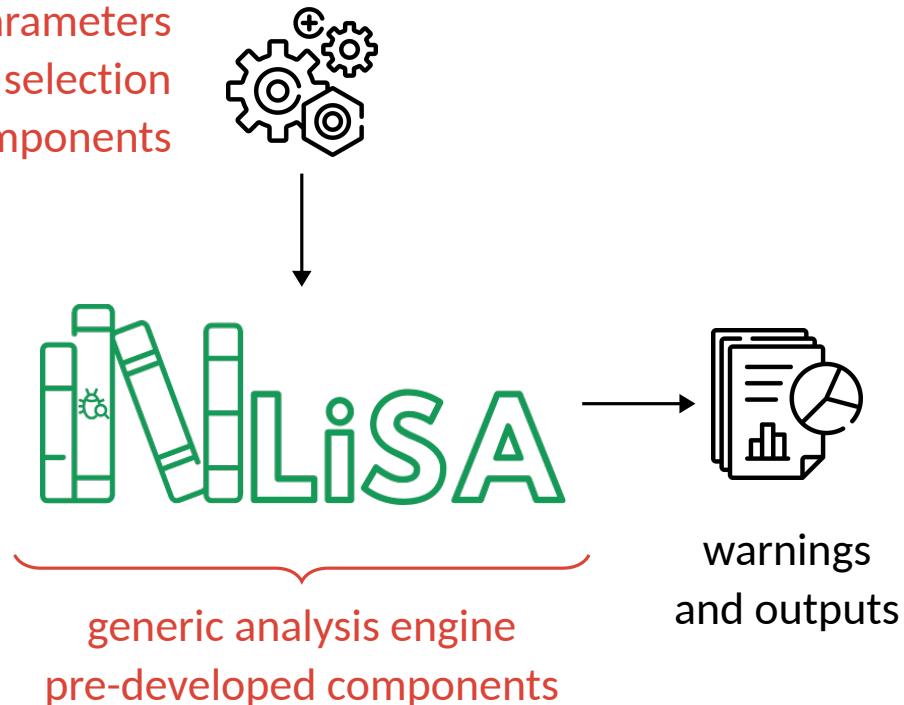
LiSA is...

configuration parameters
components selection
plug-in new components

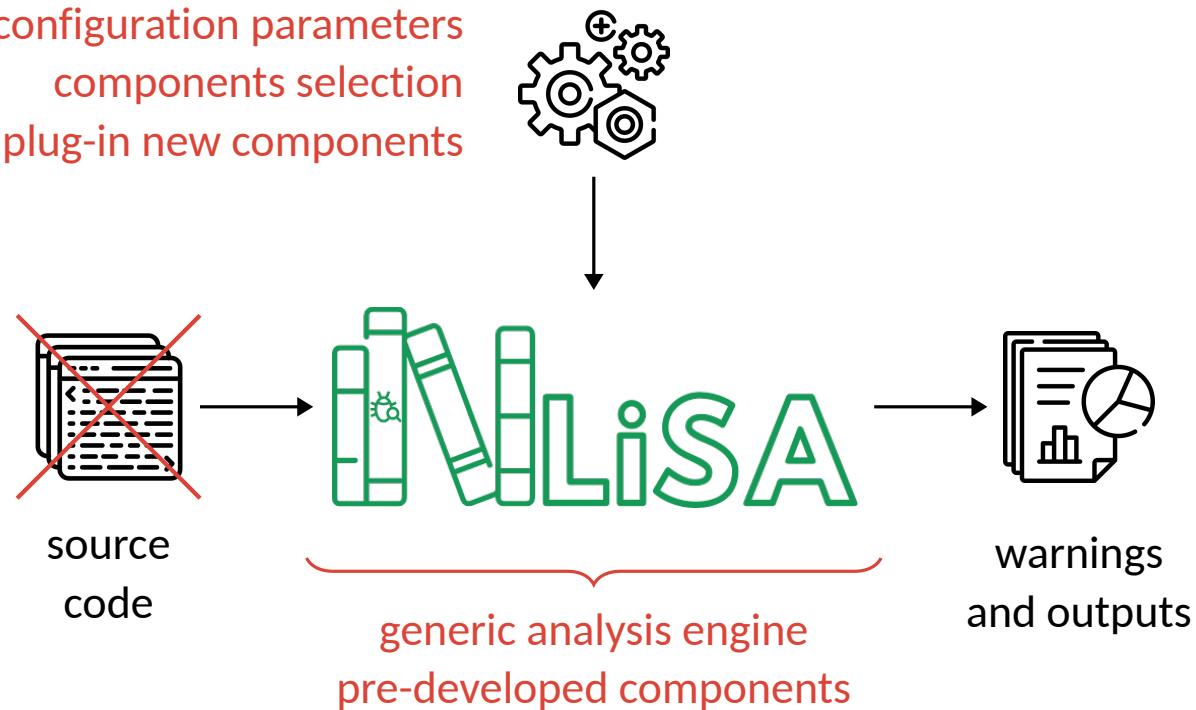


LiSA is...

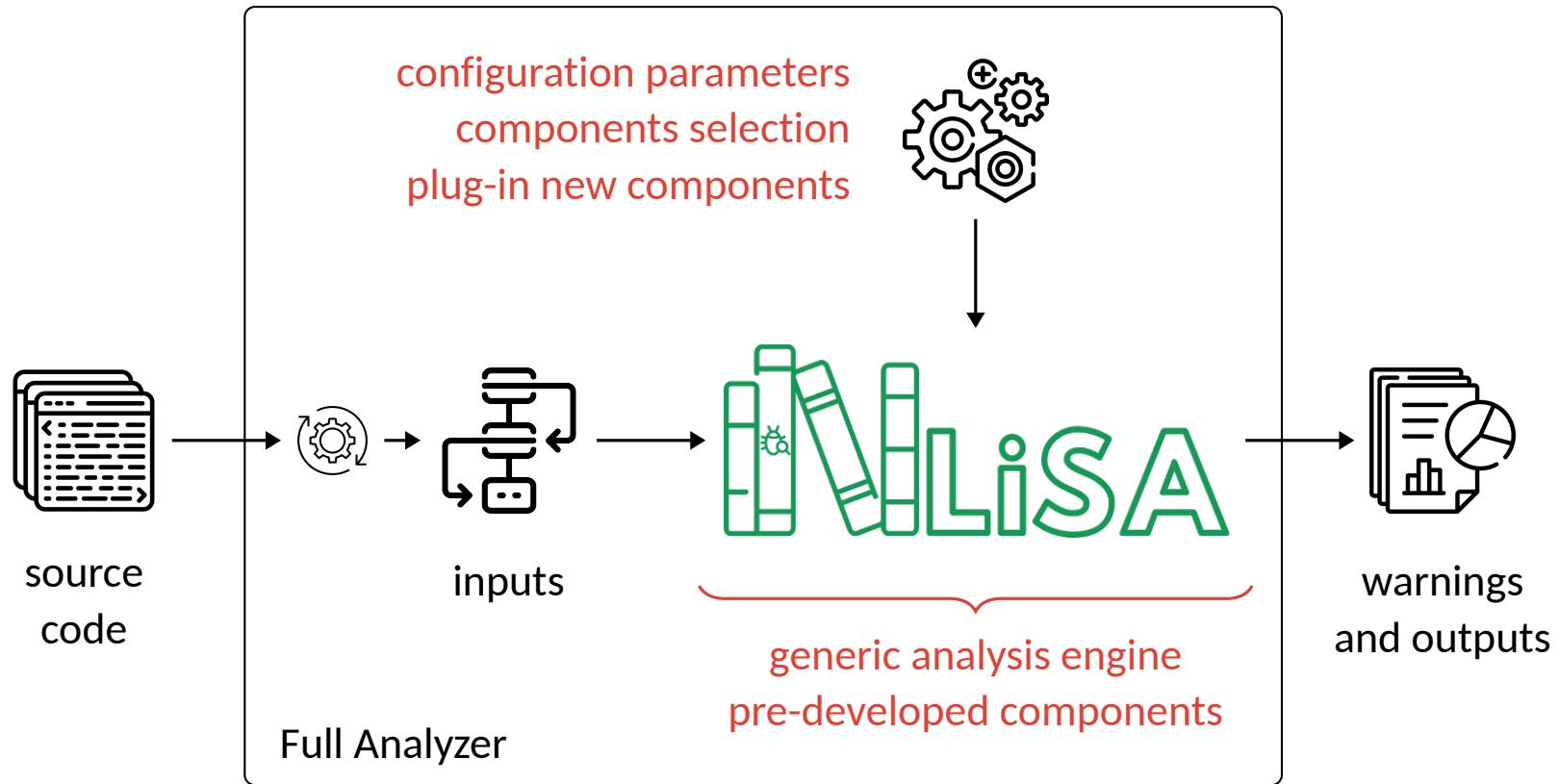
configuration parameters
components selection
plug-in new components



LiSA is... Not a Full Analyzer



LiSA is... a Library



LiSA Today

Languages:

- Go
- Michelson
- EVM
- Python (wip)
- Rust (wip)
- LLVM (wip)

Topics:

- Blockchain
- Strings
- Dynamic languages
- Numeric trends
- Data Science (wip)
- Modular interactions (wip)

Teaching:

- SCSR @ Ca' Foscari: used for 4 years!
- Seminars and tutorials all around

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4.1 The Signs Domain

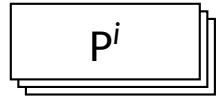
4.2 The Intervals Domain

4.3 The Upper Bounds Domain

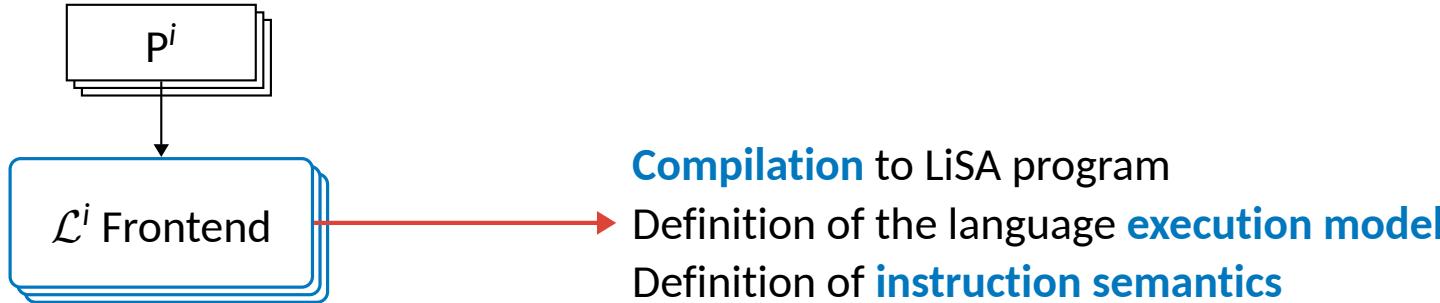
4.4 The Pentagons Domain

4.5 Information flow: the Taint analysis

LiSA Overview

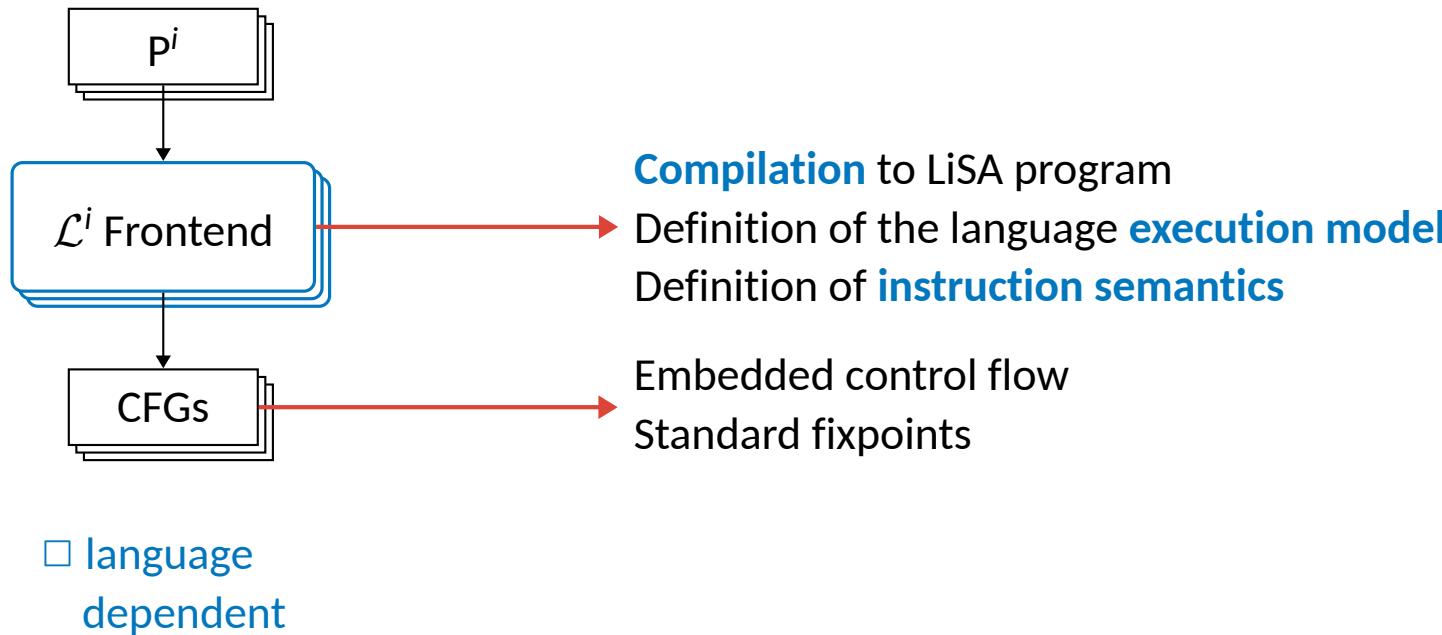


LiSA Overview



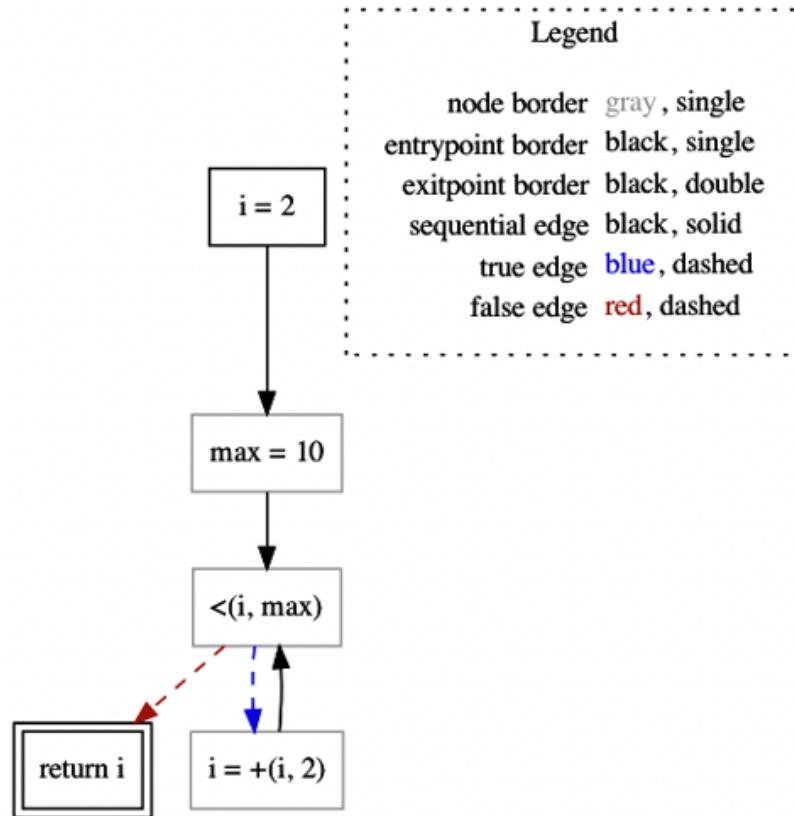
language
dependent

LiSA Overview



CFGs

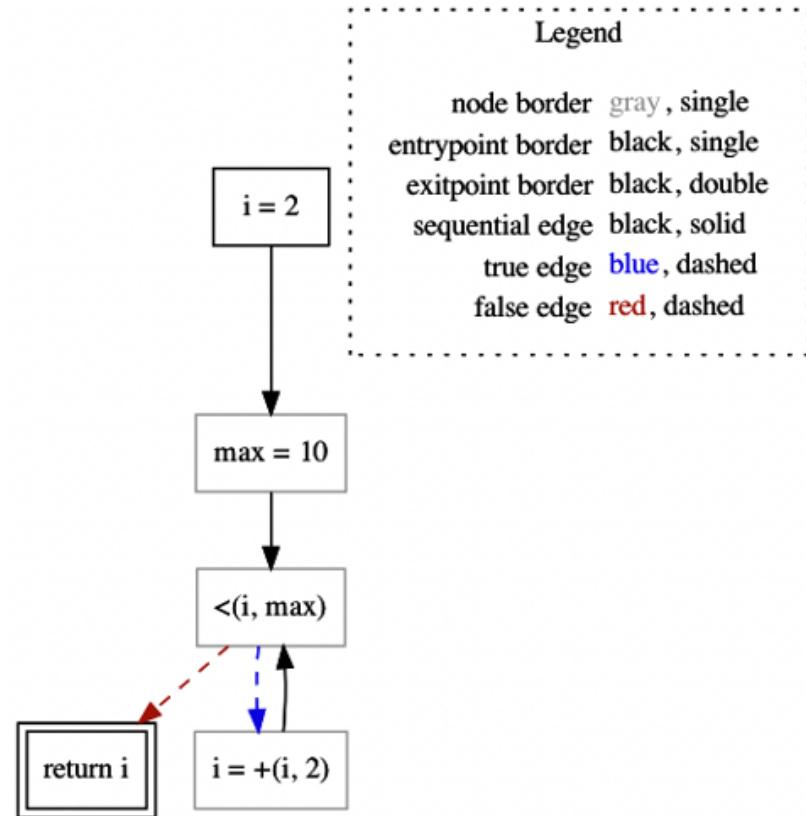
```
1 int i = 2;  
2 int max = 10;  
3 while (i < max)  
4     i = i + 1;  
5 return i;
```



CFGs

```
1 int i = 2;  
2 int max = 10;  
3 while (i < max)  
4     i = i + 1;  
5 return i;
```

Nodes are [Statement](#) instances

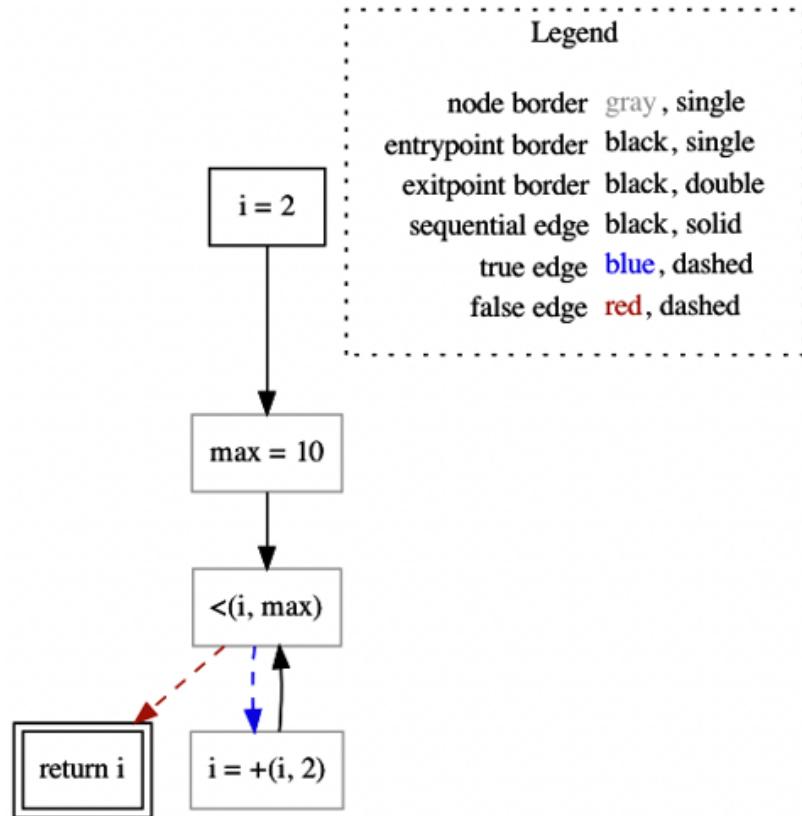


CFGs

```
1 int i = 2;  
2 int max = 10;  
3 while (i < max)  
4     i = i + 1;  
5 return i;
```

Nodes are [Statement](#) instances

Edges are [Edge](#) instances



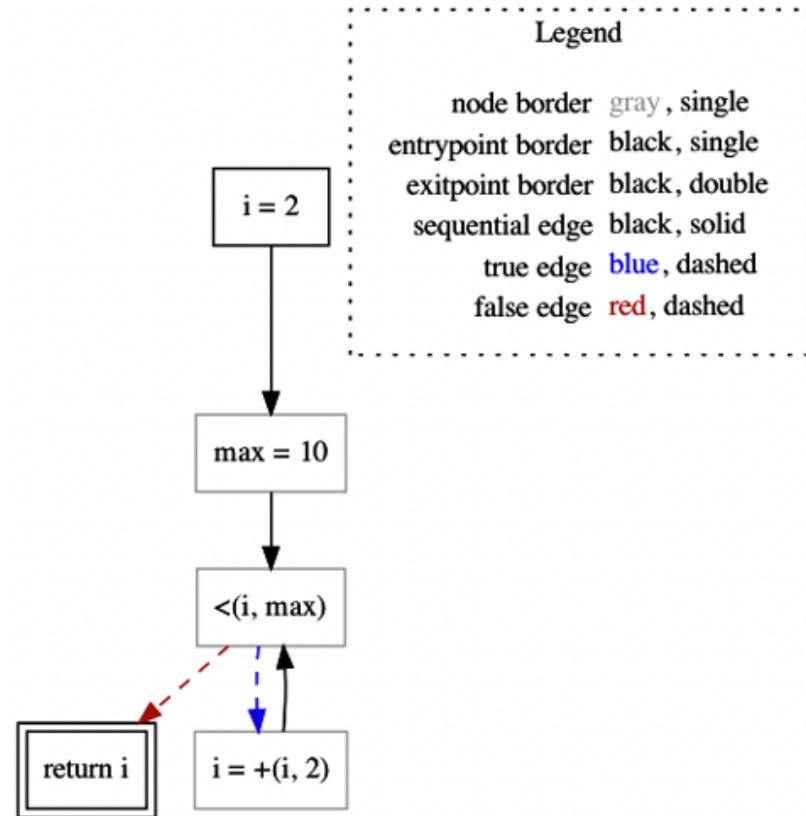
CFGs

```
1 int i = 2;  
2 int max = 10;  
3 while (i < max)  
4     i = i + 1;  
5 return i;
```

Nodes are [Statement](#) instances

Edges are [Edge](#) instances

LiSA does not fix a semantics for any [Statement](#)/[Edge](#), but lets users define them (more details later)



Computing Fixpoints on CFGs

Computing Fixpoints on CFGs

1 **forall** $n \in N$ **do**

2 | $out_n \leftarrow \perp;$  \perp for not yet processed/unreachable

Computing Fixpoints on CFGs

```
1 forall  $n \in N$  do
2   |  $out_n \leftarrow \perp;$  ←  $\perp$  for not yet processed/unreachable
3   |  $in_{n_0} \leftarrow T;$  ←  $T$  for no information
```

Computing Fixpoints on CFGs

```
1 forall n ∈ N do
2   | outn ← ⊥; ← ⊥ for not yet processed/unreachable
3   | inn0 ← T; ← T for no information
4   | outn0 ← semanticsn0(inn0); ← use Statement.semantics()
```

Computing Fixpoints on CFGs

```
1 forall n ∈ N do
2   | outn ← ⊥; ← ⊥ for not yet processed/unreachable
3   | inn0 ← T; ← T for no information
4   | outn0 ← semanticsn0(inn0); ← use Statement.semantics()
5   ws ← succ(n0);
```

Computing Fixpoints on CFGs

```
1 forall n ∈ N do
2   | outn ← ⊥; ← ⊥ for not yet processed/unreachable
3   | inn0 ← T; ← T for no information
4   | outn0 ← semanticsn0(inn0); ← use Statement.semantics()
5   ws ← succ(n0);
6 while ws ≠ ∅ do
7   | n ← pop(ws);
```

Computing Fixpoints on CFGs

```
1 forall  $n \in N$  do
2   |  $out_n \leftarrow \perp;$  ⊥ for not yet processed/unreachable
3   |  $in_{n_0} \leftarrow T;$  T for no information
4   |  $out_{n_0} \leftarrow semantics_{n_0}(in_{n_0});$  use Statement.semantics()
5   ws  $\leftarrow succ(n_0);$ 
6 while ws  $\neq \emptyset$  do
7   |  $n \leftarrow pop(ws);$ 
8   |  $in_n \leftarrow \sqcup\{traverse_{m \rightarrow n}(out_m) : m \in preds(n)\};$  \sqcup to over-approximate entry states
use Edge.traverse()
9
10  |  $tmp_n \leftarrow semantics_n(in_n);$ 
```

Computing Fixpoints on CFGs

```
1 forall  $n \in N$  do
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4   |  $out_{n_0} \leftarrow \text{semantics}_{n_0}(in_{n_0});$  use Statement.semantics()
5   |  $ws \leftarrow \text{succ}(n_0);$ 
6 while  $ws \neq \emptyset$  do
7   |  $n \leftarrow \text{pop}(ws);$ 
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use Edge.traverse()
9   |  $tmp_n \leftarrow \text{semantics}_n(in_n);$ 
10  | if  $tmp_n \not\sqsubseteq out_n$  then sqsubseteq to keep “highest” result
11  |
```

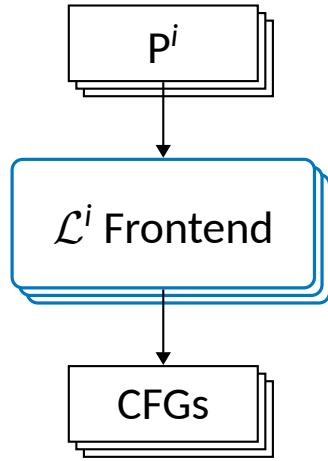
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11    |   |  $out_n \leftarrow out_n \oplus tmp_n;$  sqcup to move "upwards"/ $\nabla$  for convergence
12    |   | ws  $\leftarrow ws \cup \text{succ}(n);$ 
13
```

Computing Fixpoints on CFGs

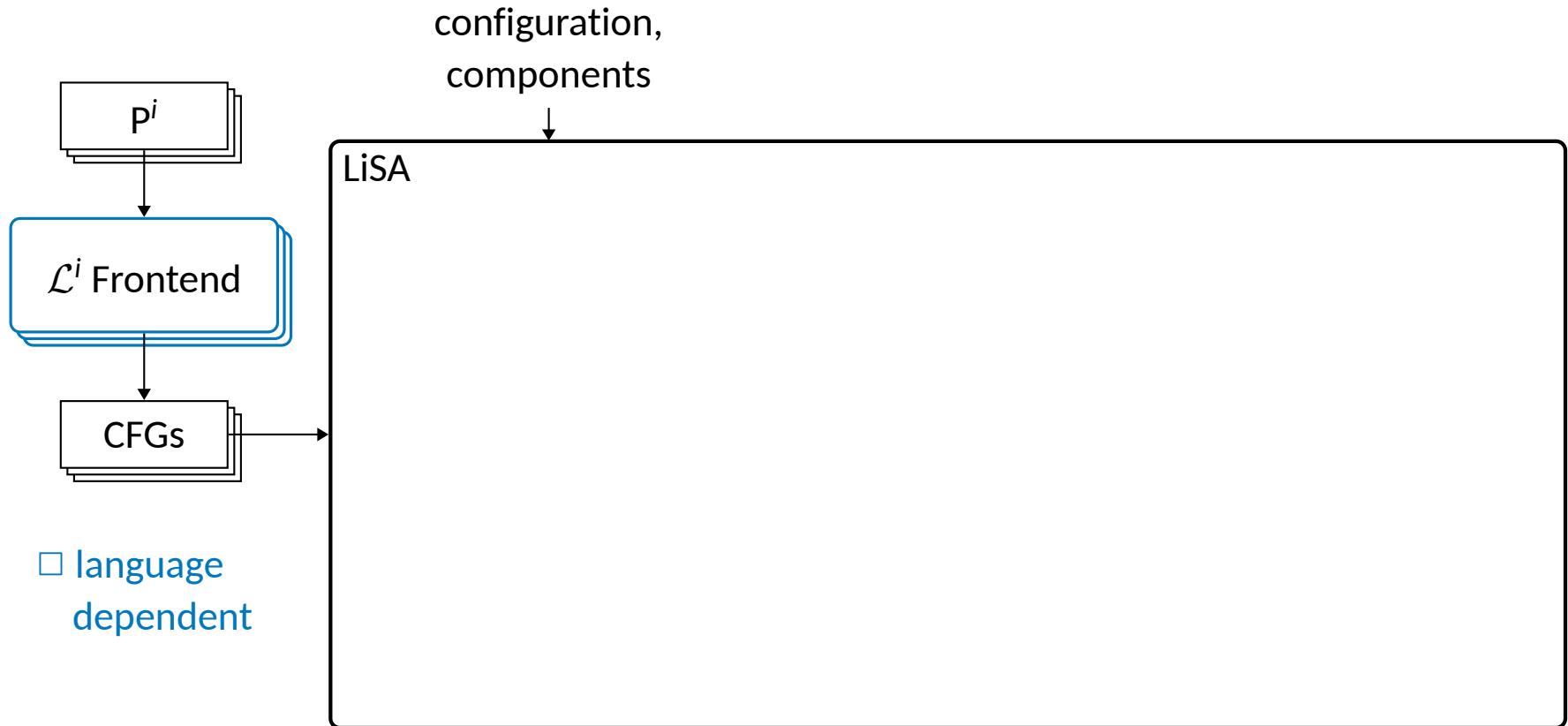
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11     $out_n \leftarrow out_n \oplus tmp_n;$  sqcup to move "upwards"/ $\nabla$  for convergence
12    ws  $\leftarrow ws \cup \text{succ}(n);$ 
13
14 return out;
```

LiSA Overview

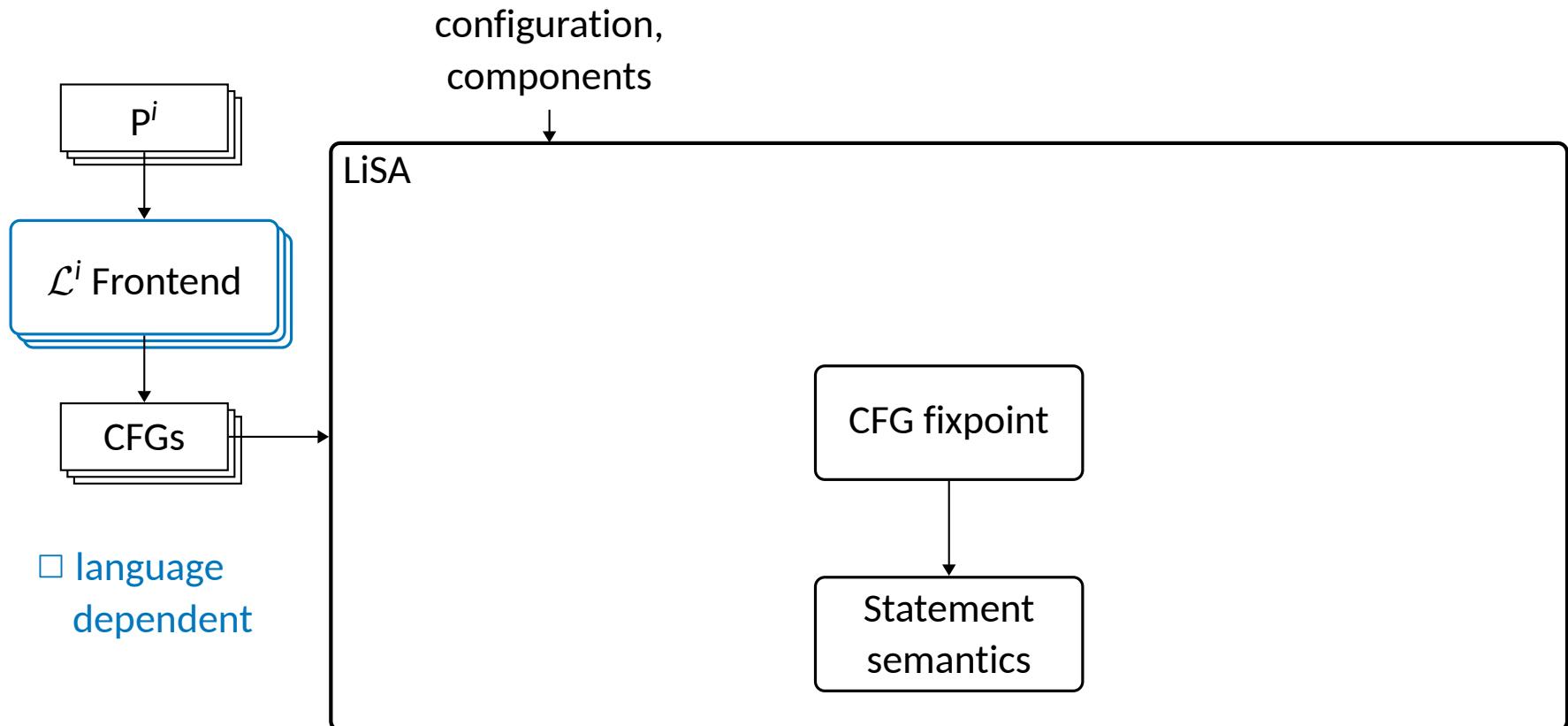


language
dependent

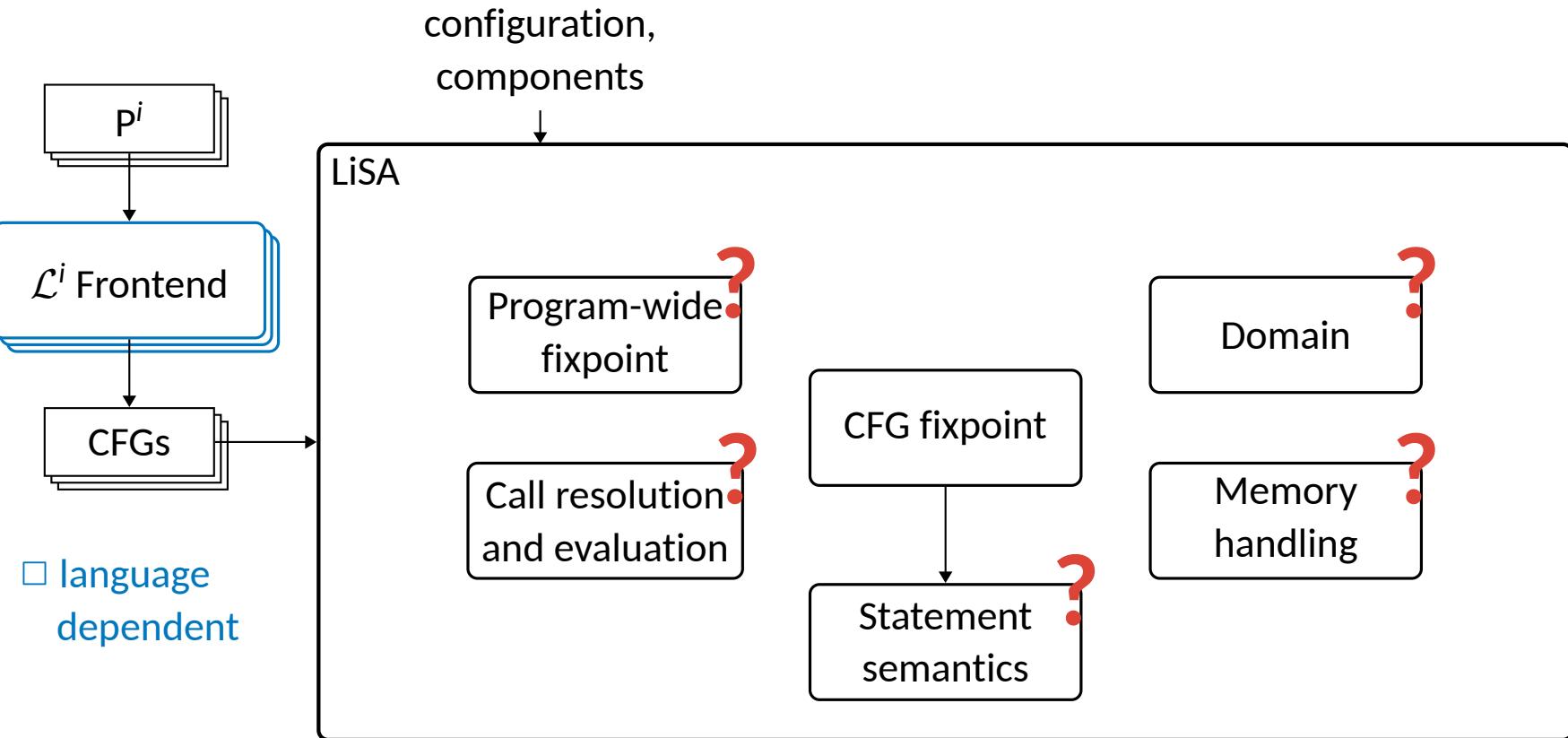
LiSA Overview



LiSA Overview



LiSA Overview



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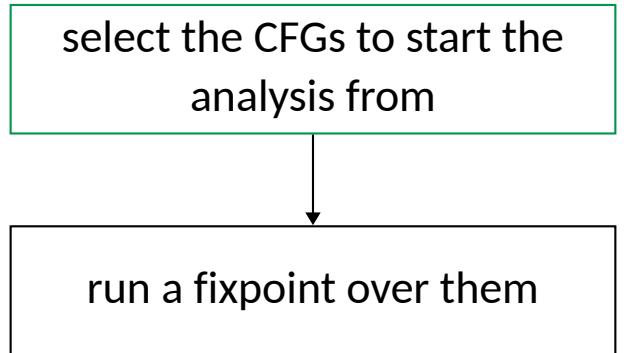
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The Program-wide Fixpoint

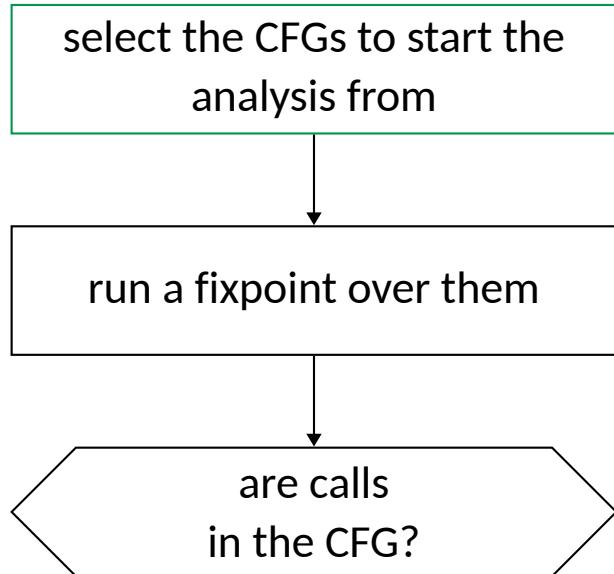
The Program-wide Fixpoint

select the CFGs to start the
analysis from

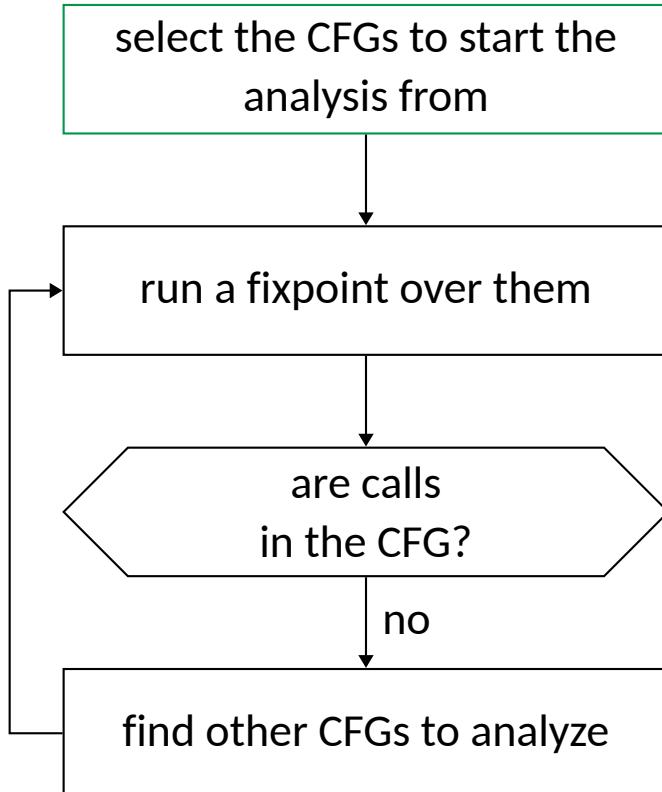
The Program-wide Fixpoint



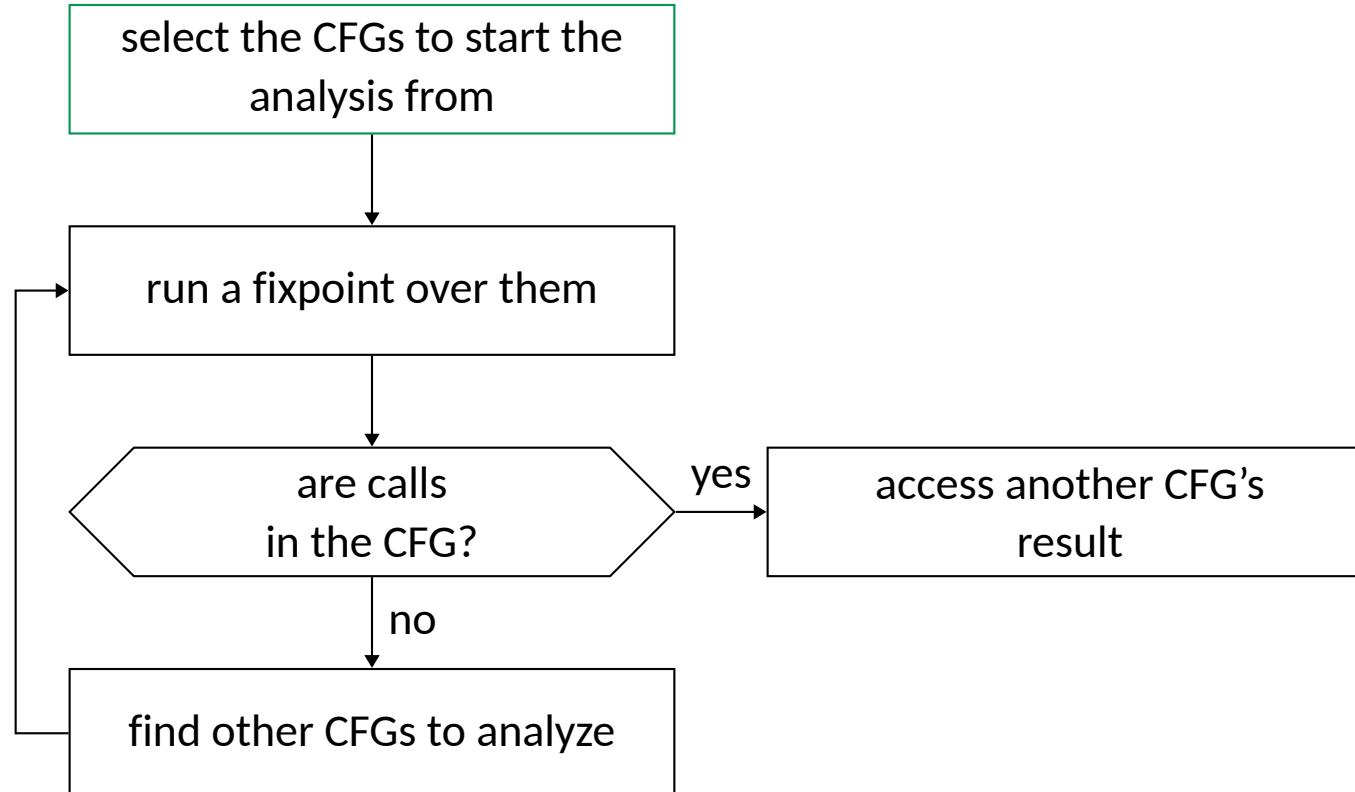
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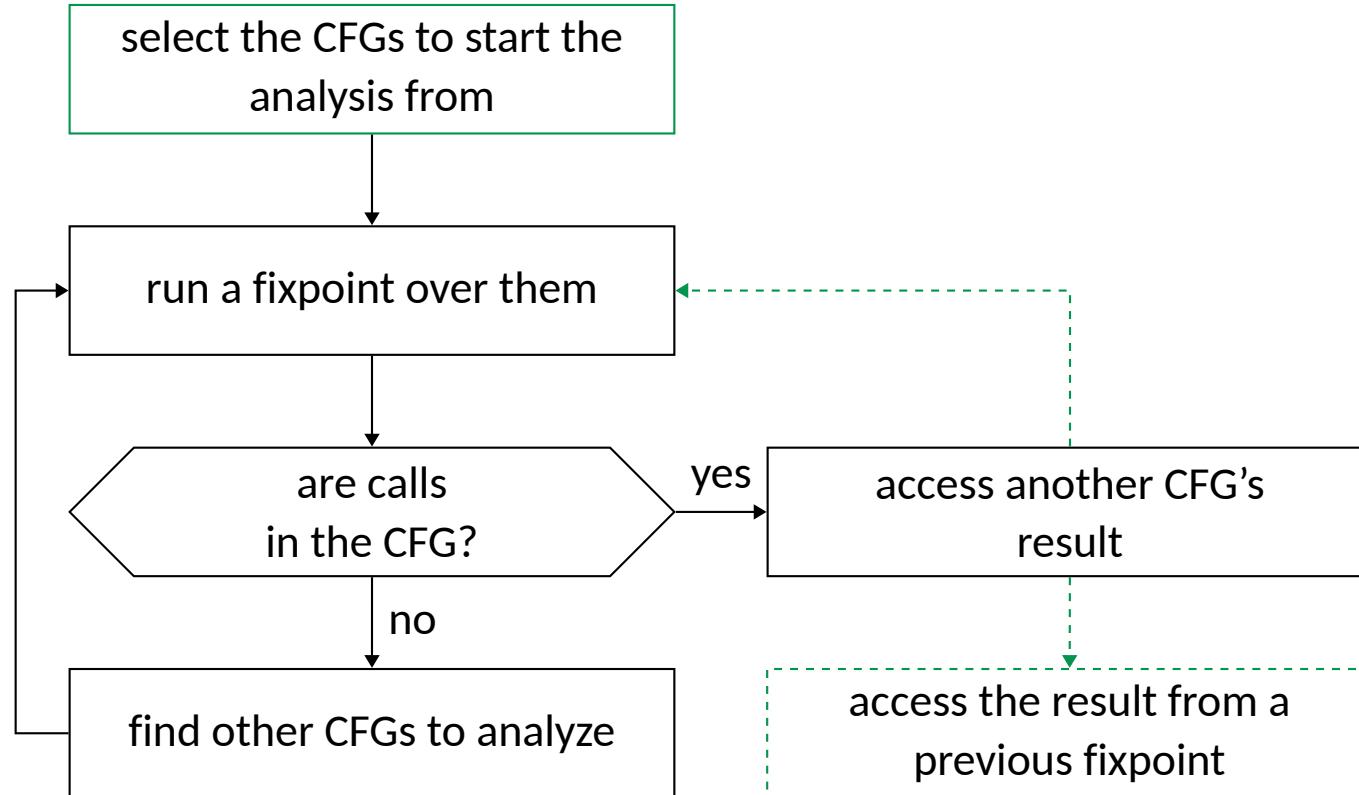
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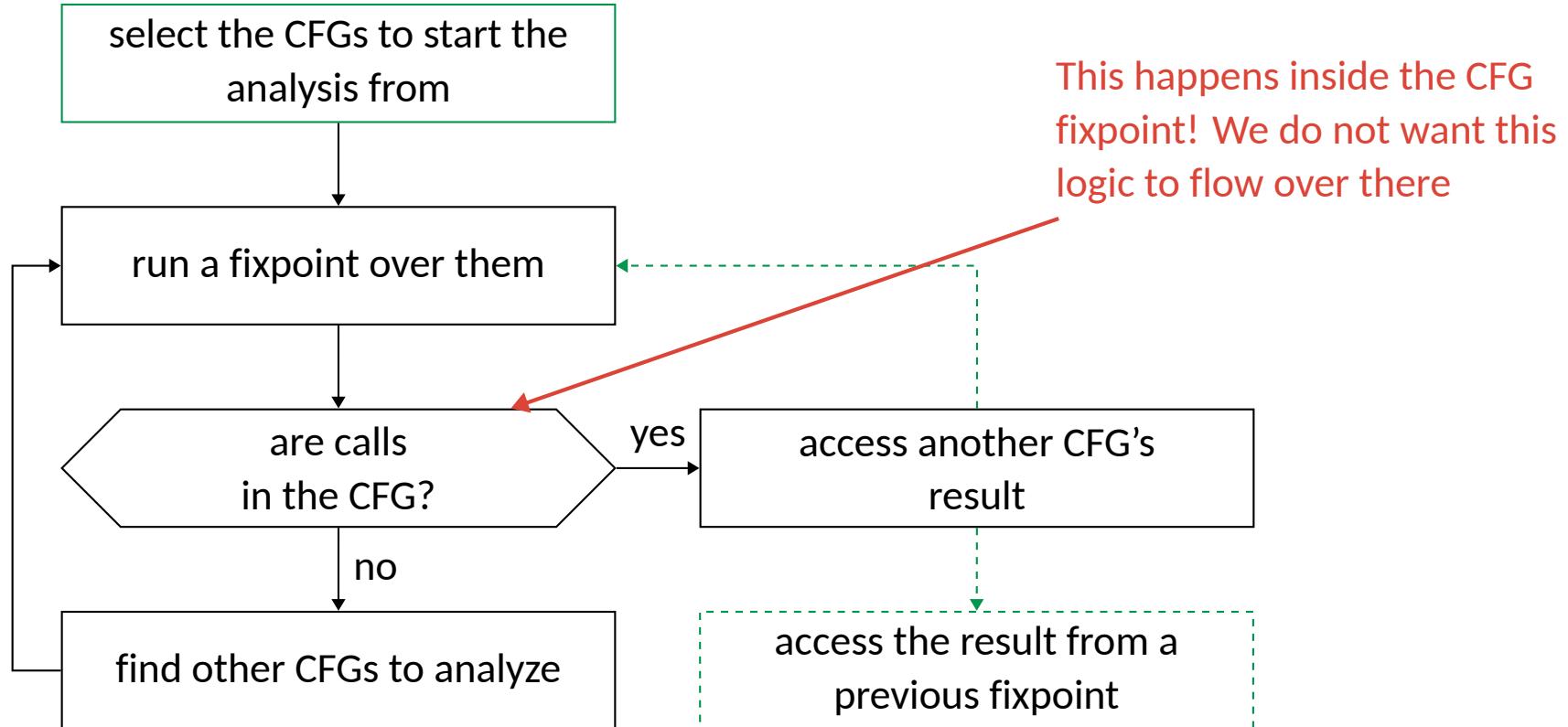
The Program-wide Fixpoint



The Program-wide Fixpoint



The Program-wide Fixpoint



The Interprocedural Analysis

Interprocedural
Analysis

configurable

The Interprocedural Analysis



Logic can be:

- Consider CFGs in isolation
- Start at main and follow calls
- ...

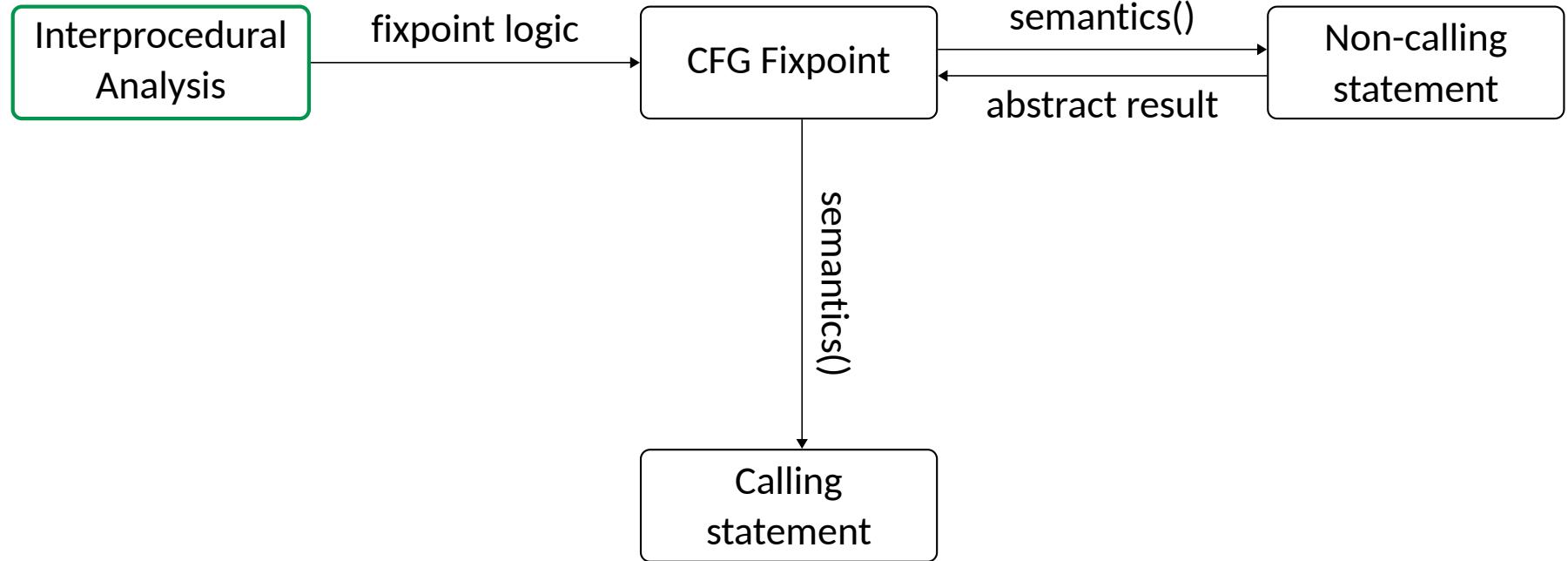
configurable

The Interprocedural Analysis



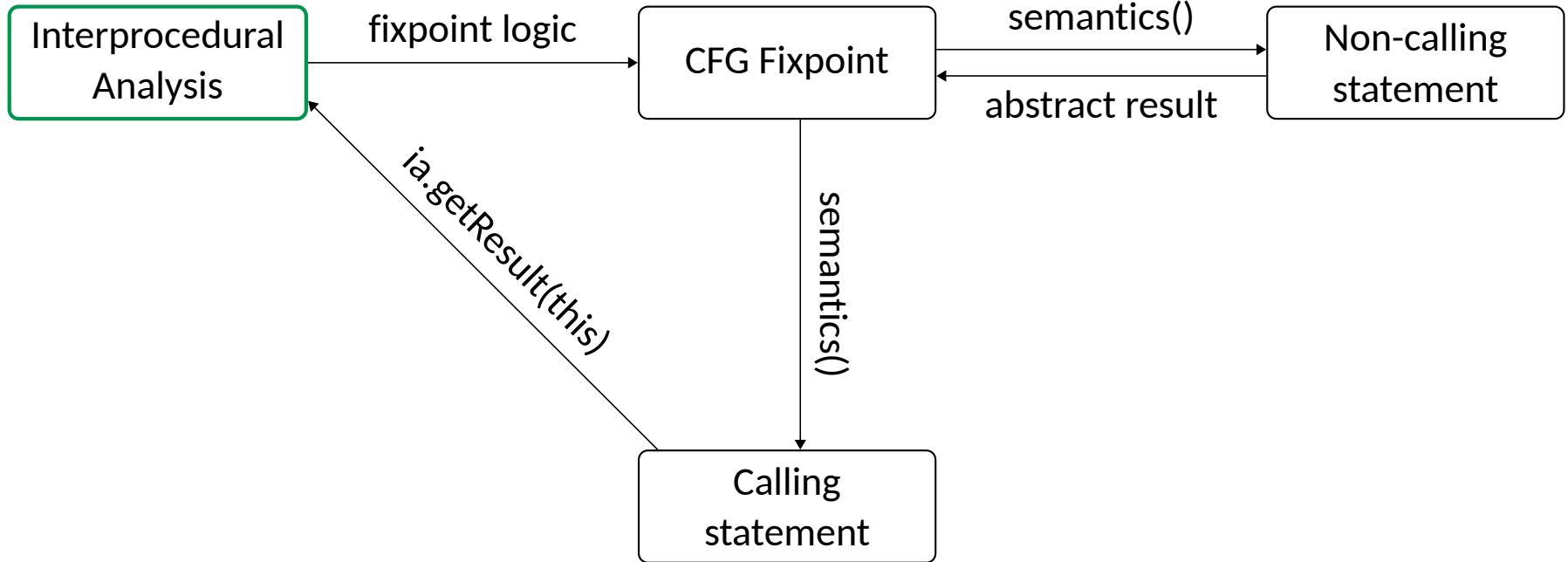
configurable

The Interprocedural Analysis



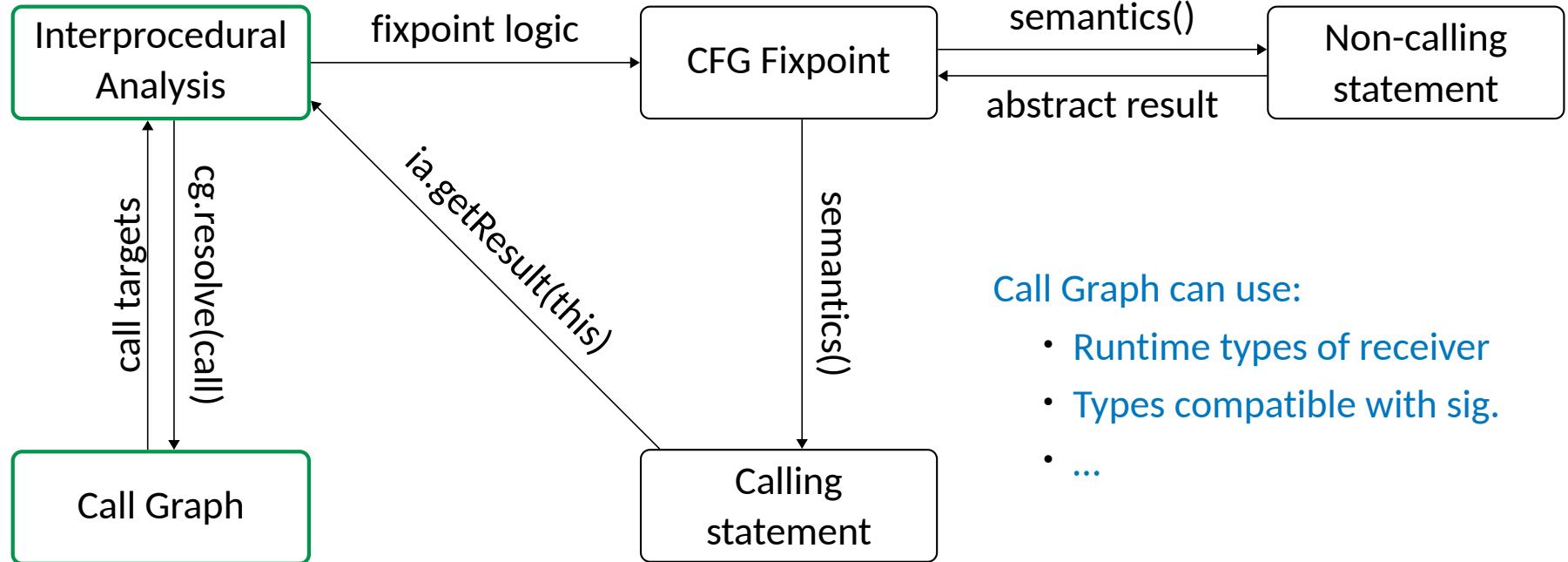
configurable

The Interprocedural Analysis



configurable

The Interprocedural Analysis

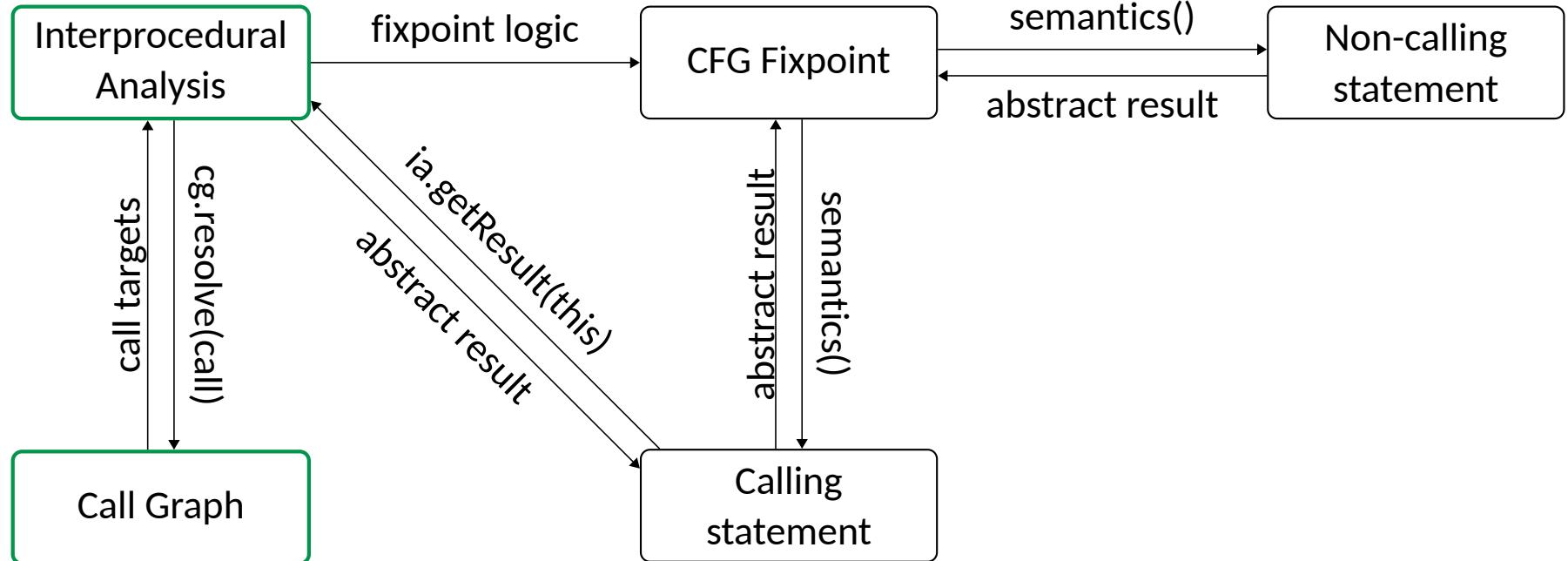


□ configurable

Call Graph can use:

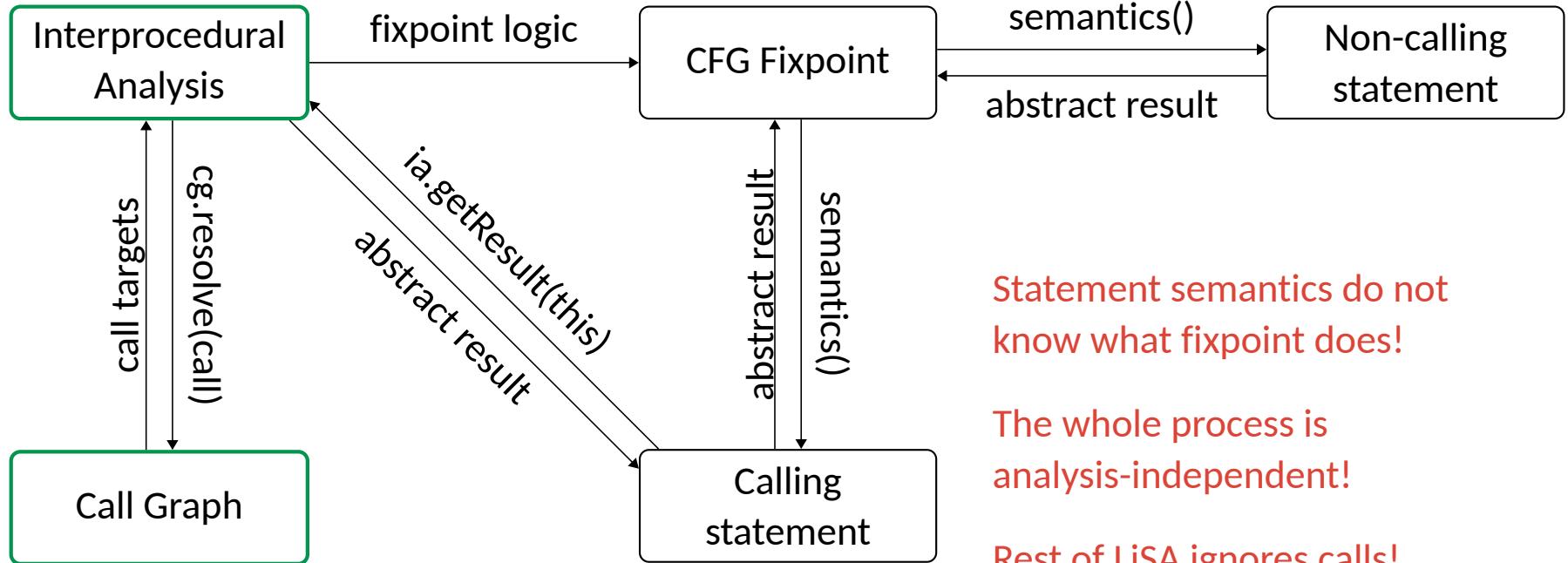
- Runtime types of receiver
- Types compatible with sig.
- ...

The Interprocedural Analysis



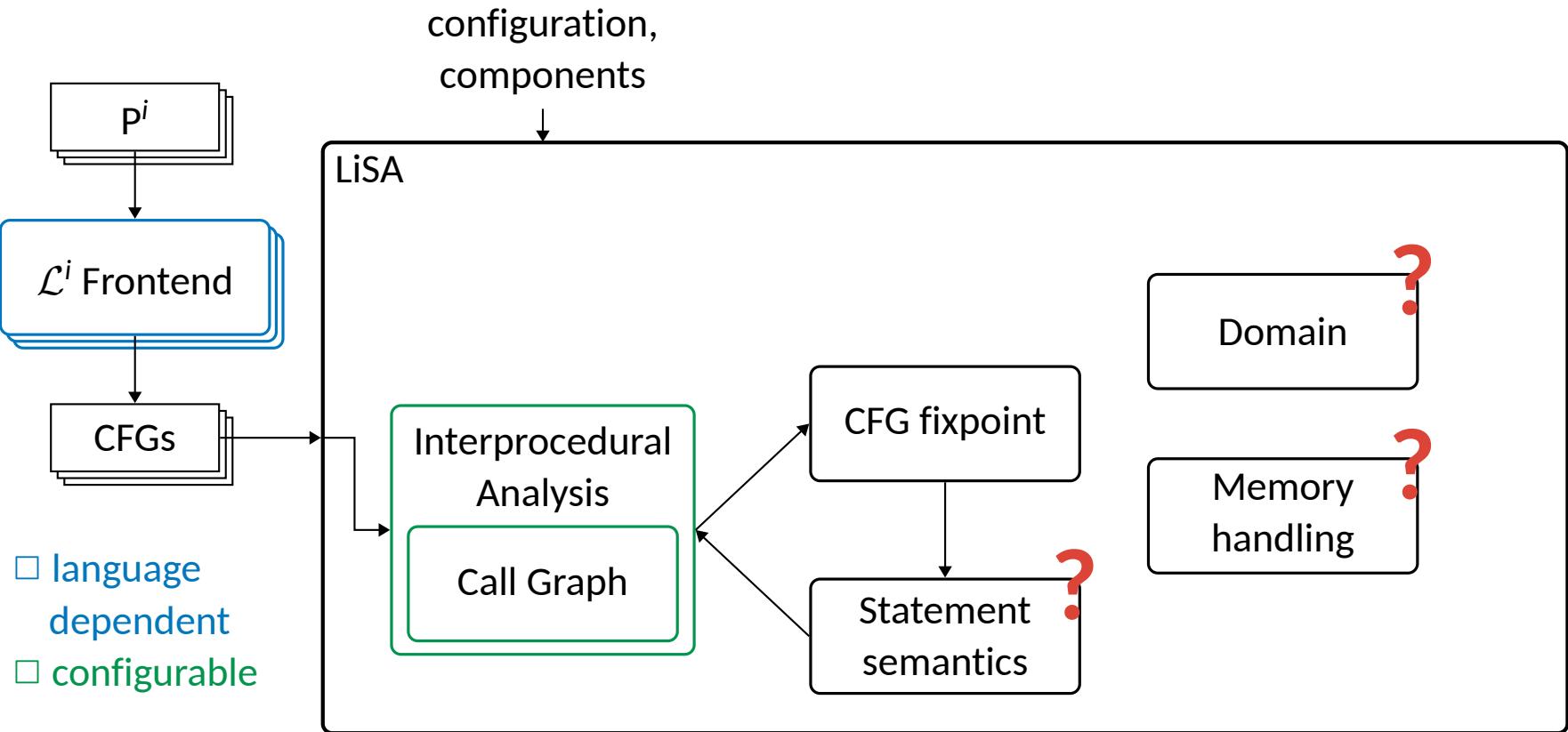
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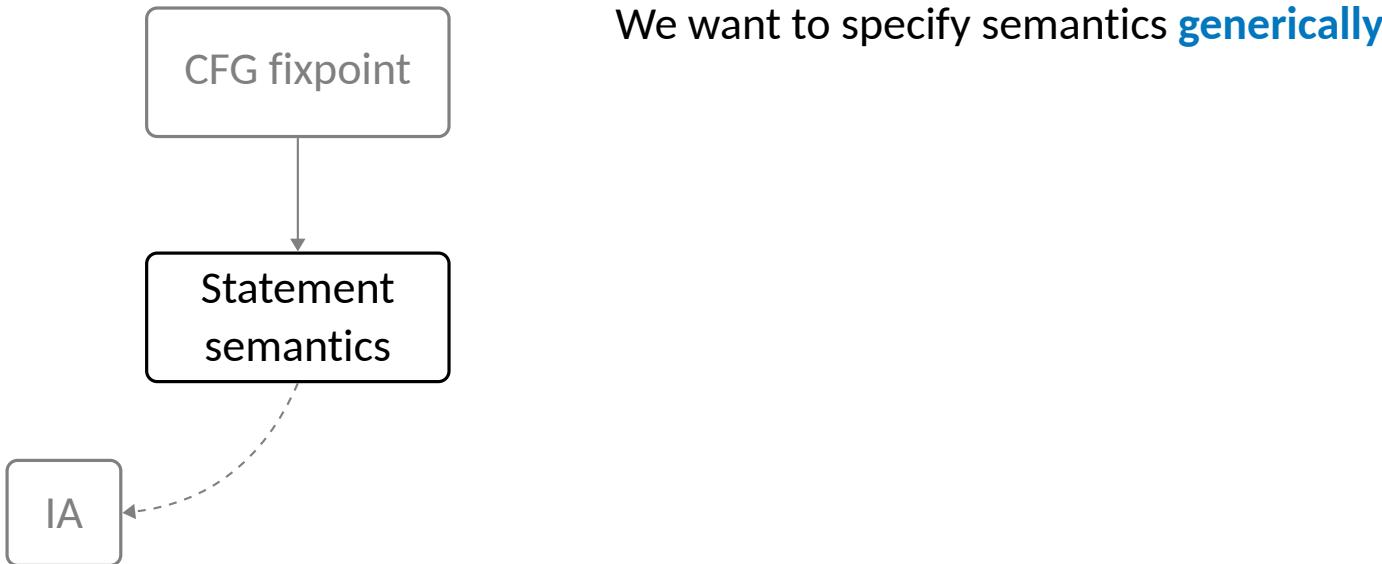
LiSA Overview



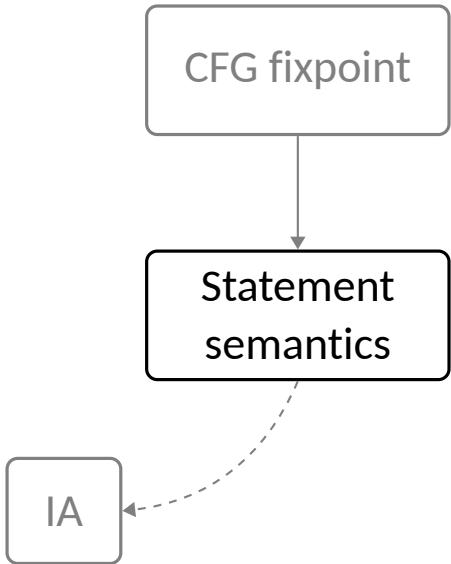
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Syntax vs Semantics



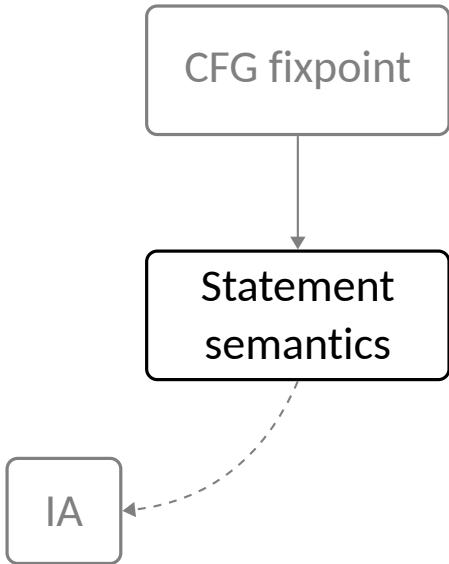
Syntax vs Semantics



We want to specify semantics **generically**

- It should apply to all analyses

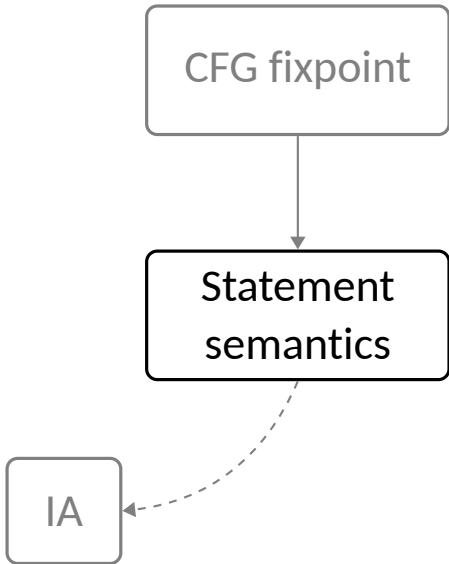
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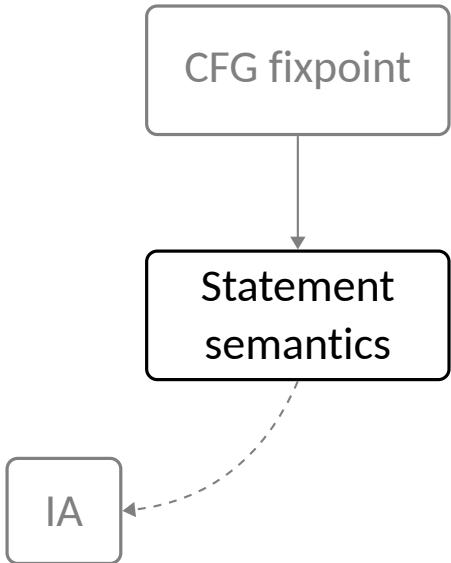
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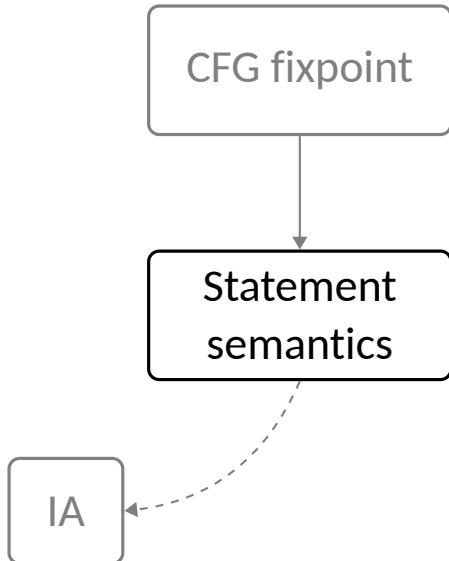
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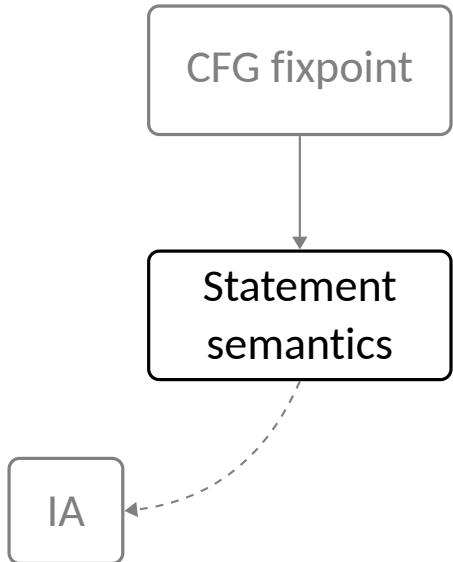


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Classic solution: rewrite to an IR

Syntax vs Semantics



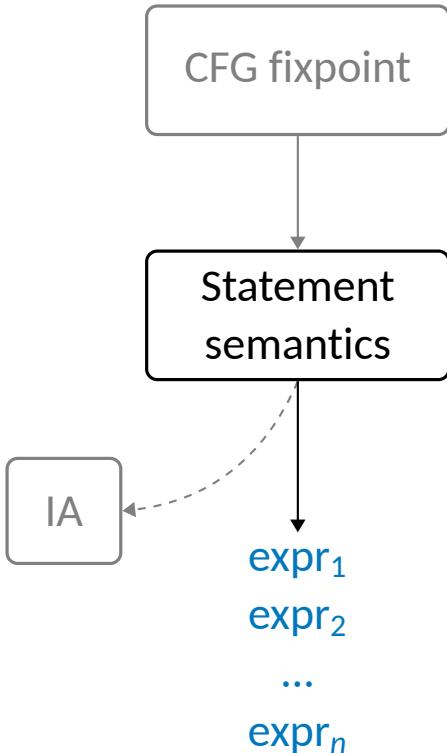
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Classic solution: rewrite to an IR

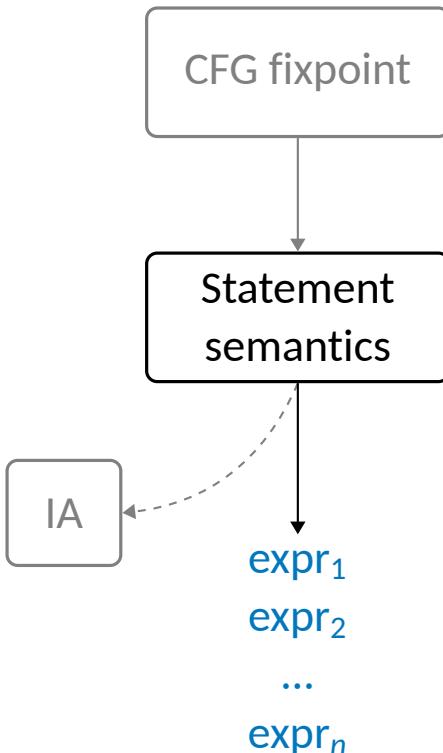
But we might want to exploit semantic information!

Symbolic Expressions



Our solution: break **Statements** into **SymbolicExpressions**

Symbolic Expressions

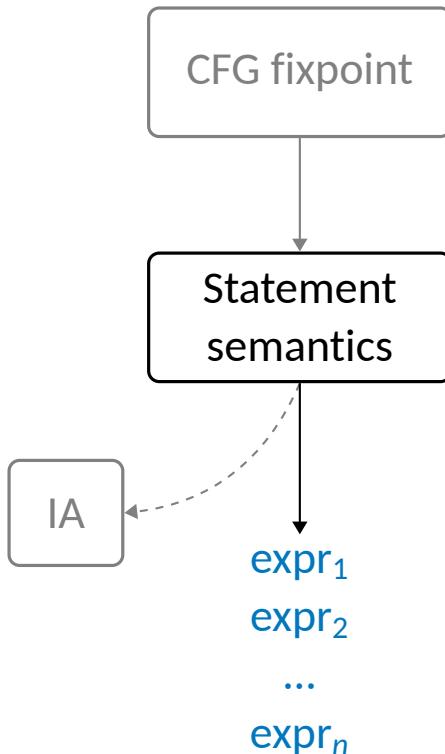


Our solution: break **Statements** into **SymbolicExpressions**

The rewriting happens **dynamically**, and can exploit the analysis

- Types, possible values, ...

Symbolic Expressions



Our solution: break **Statements** into **SymbolicExpressions**

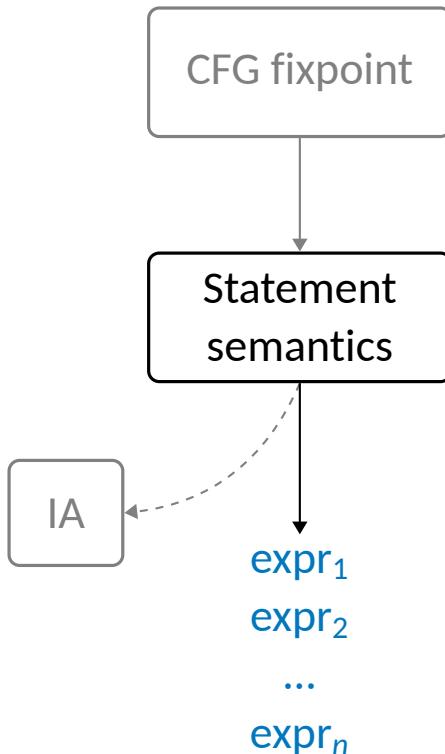
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SymbolicExpressions are **extensible**

- We provide some, but users can define more

Symbolic Expressions



Our solution: break **Statements** into **SymbolicExpressions**

The rewriting happens **dynamically**, and can exploit the analysis

- Types, possible values, ...

SymbolicExpressions are **extensible**

- We provide some, but users can define more

Analyses only have to model these expressions, ignoring the syntax behind them!

Examples (Pseudocode)

```
1 Plus.semantics(): // left + right
2   if type(left) is string or type(right) is string:
3     return domain.eval(new BinaryExpression("cat", left, right))
4   else:
5     return domain.eval(new BinaryExpression("+", left, right))
```

Examples (Pseudocode)

```
1 Plus.semantics(): // left + right
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4   else:
5     return domain.eval(new BinaryExpression("+", left, right))
```

```
1 Conditional.semantics(): // condition ? ifTrue : iffFalse
2   sat = domain.isSatisfied(condition)
3   tt = ifTrue.semantics()
4   ff = iffFalse.semantics()
5   return sat.isTrue() ? tt : (sat.IsFalse() ? ff : tt ∪ ff)
```

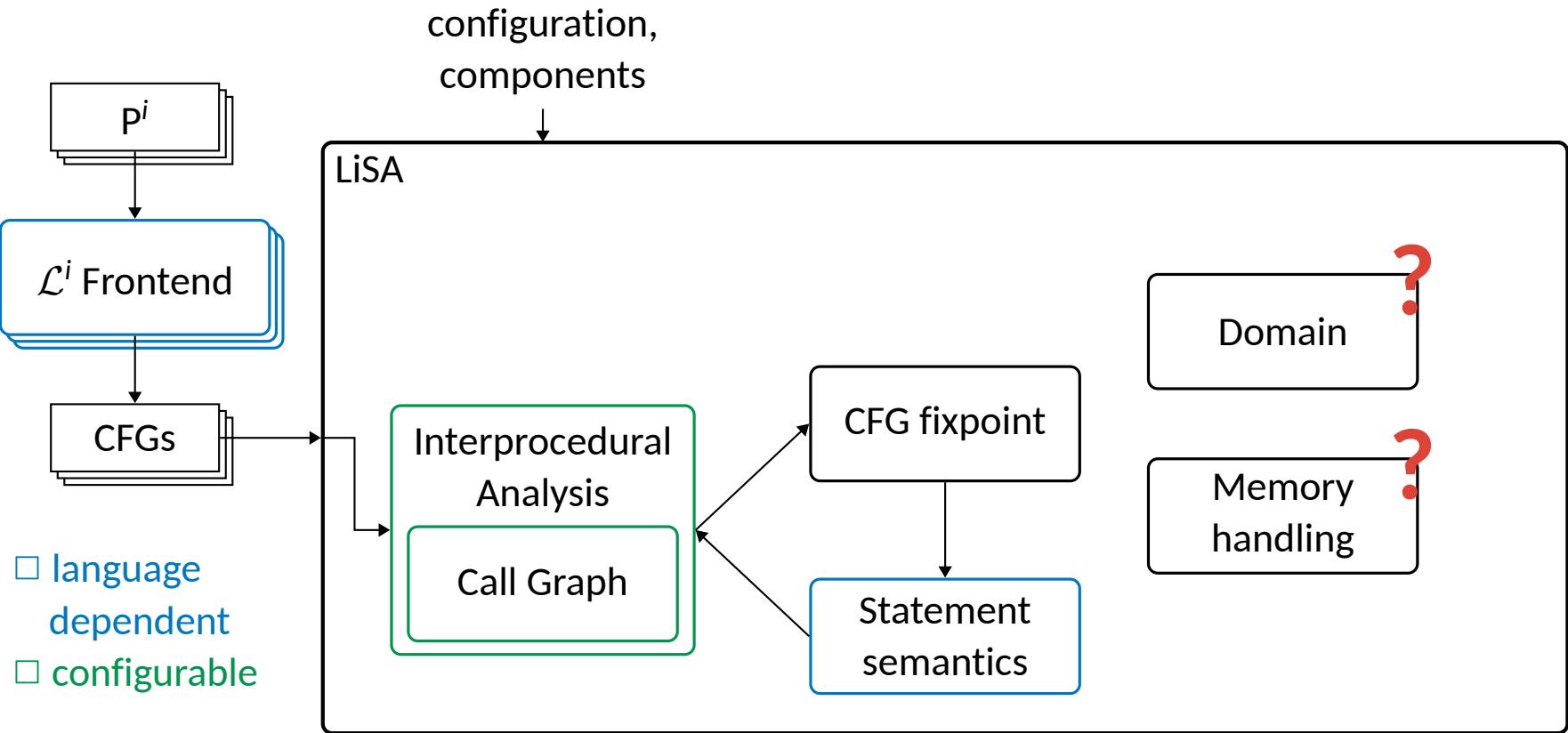
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```
1 Conditional.semantics(): // condition ? ifTrue : ifFalse
2   sat = domain.isSatisfied(condition)
3   tt = ifTrue.semantics()
4   ff = ifFalse.semantics()
5   return sat.isTrue() ? tt : (sat.isFalse() ? ff : tt ∪ ff)
```

```
1 PreIncrement.semantics(): // ++var
2   add = new BinaryExpression("+", var, new Const(1))
3   d1 = domain.store(var, add)
4   return d1.eval(var)
```

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Combining Values and Memory

While calls are “easy” to abstract away, dynamic memory (stack or heap) and computed values are **strongly coupled**

- Values are moved from variables to dynamic memory continuously

Combining Values and Memory

While calls are “easy” to abstract away, dynamic memory (stack or heap) and computed values are **strongly coupled**

- Values are moved from variables to dynamic memory continuously

Despite this, we still want to keep management of the two **separate**

- For **reusability**
- To reduce the **complexity** of the implementations
- To allow newcomers to write only the analyses they need

What Happens Concretely?

Every memory-dealing instruction “refers” to an address in memory

```
1 class Foo {  
2     int f, g;  
3     Foo() {  
4         f = 1;  
5         g = 2;  
6     }  
7 }
```

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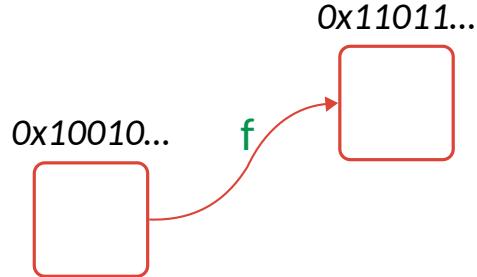
0x10010...



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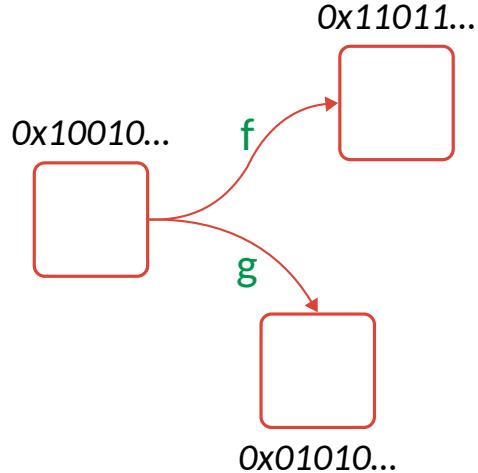
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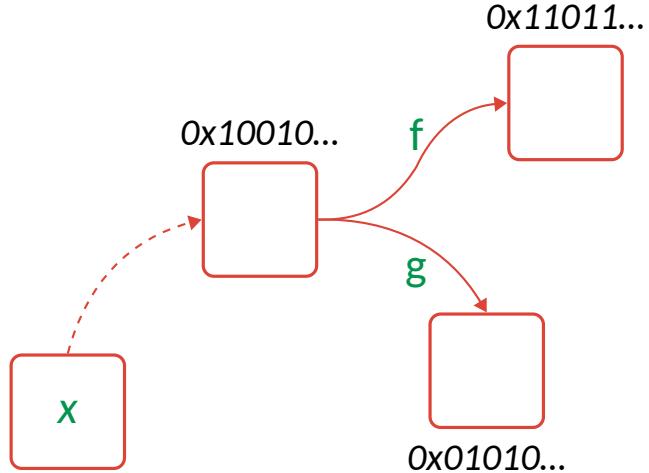
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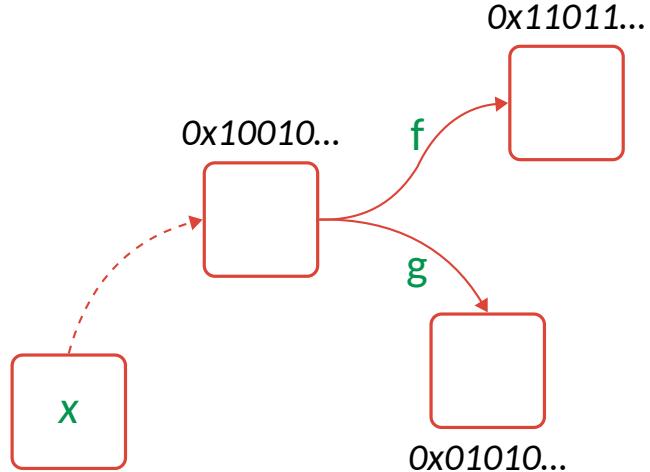
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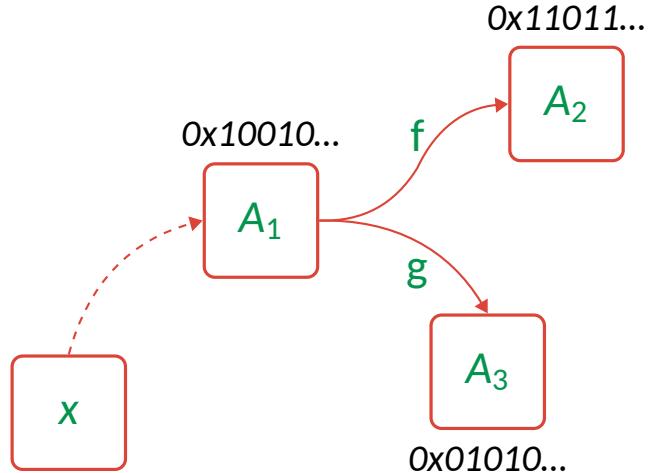


What if we treat addresses as variables?

What Happens Concretely?

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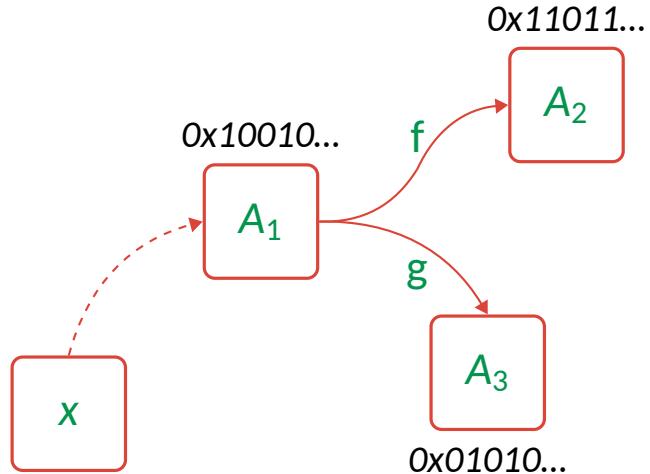


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What Happens Concretely?

Every memory-dealing instruction “refers” to an address in memory

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1 class Foo {  
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6     }  
7 }
```



```
1 x = new Foo();  
2 x.f = 5;  
3 x.g = 7;
```

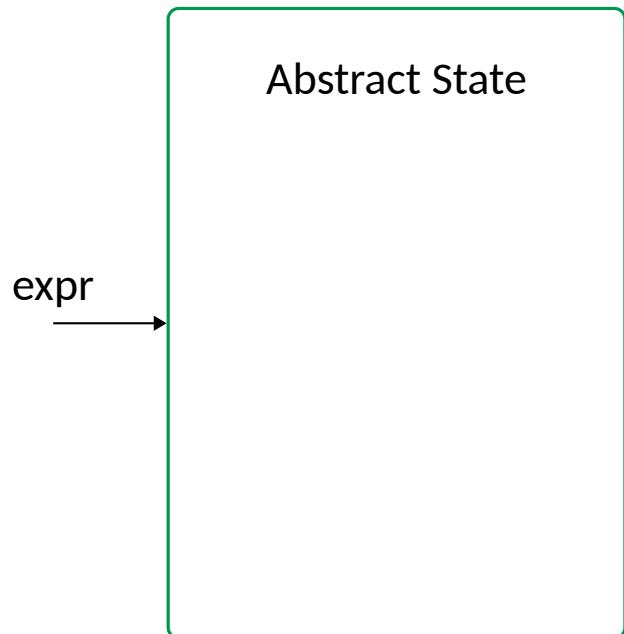
Becomes:

```
1 x = &A1;  
2 A2 = 5;  
3 A3 = 7;
```

What if we treat addresses as variables?

The Abstract State

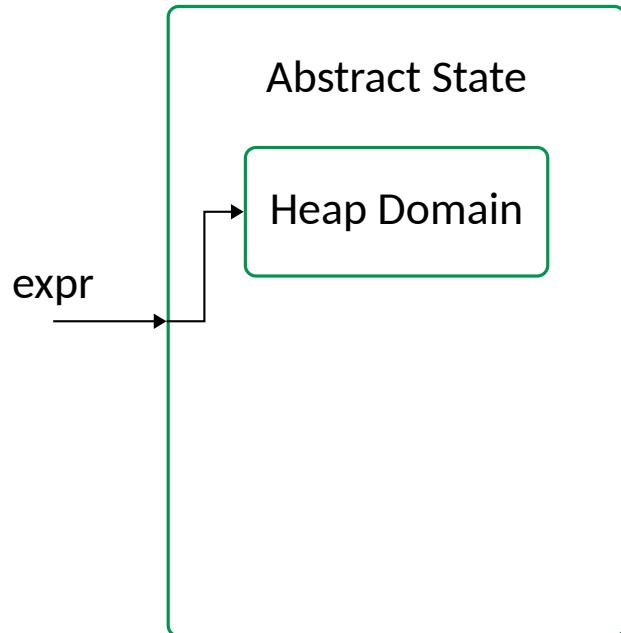
[Fer16]



configurable

The Abstract State

[Fer16]



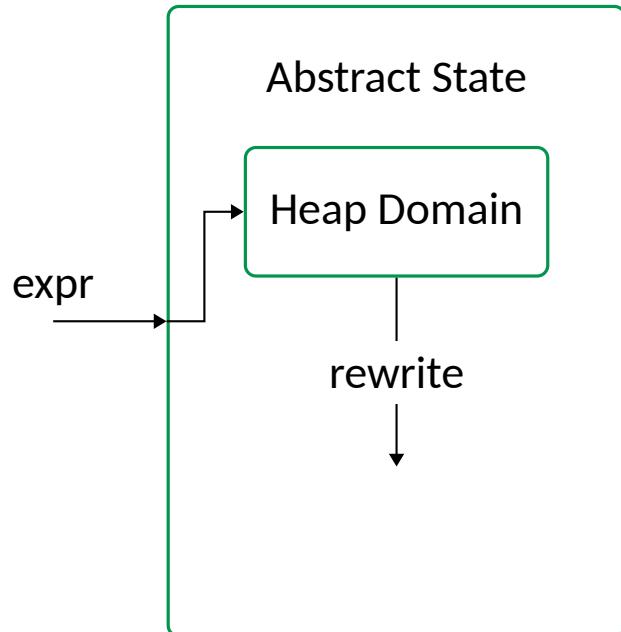
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- new allocations
- pointer aliasing
- ...

configurable

The Abstract State

[Fer16]



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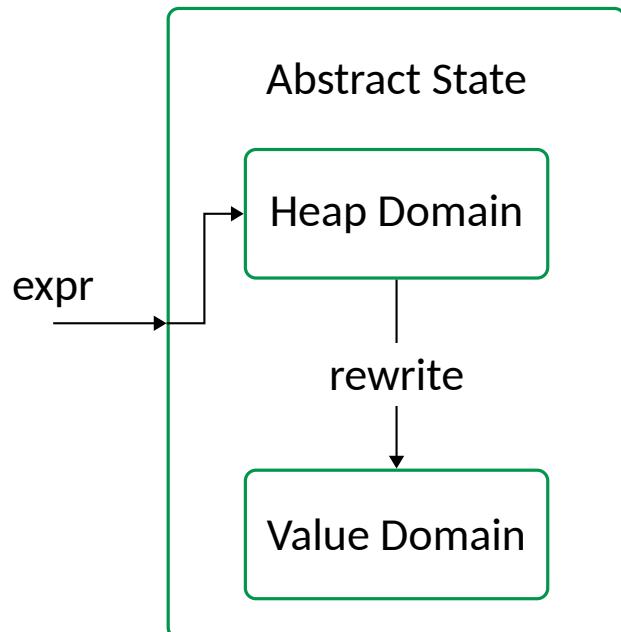
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The Heap Domain **rewrites memory-related expressions** to their symbolic variables

configurable

The Abstract State

[Fer16]



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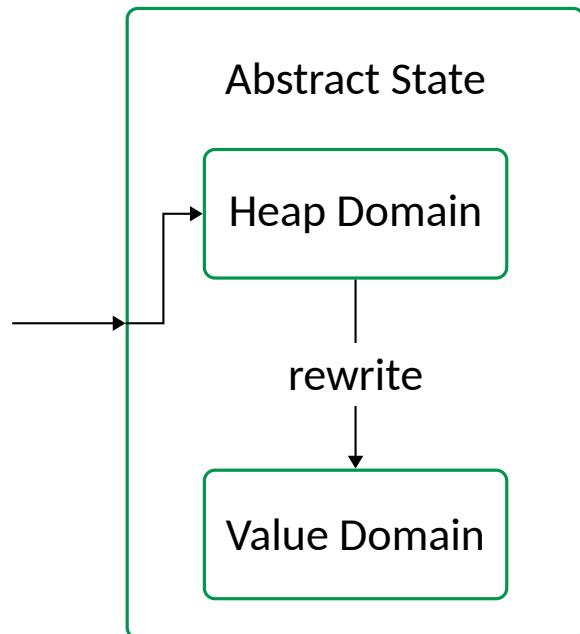
The Heap Domain **rewrites memory-related expressions** to their symbolic variables

The Value Domain only “sees” expressions with **variables and constants!**

configurable

The Abstract State

[Fer16]

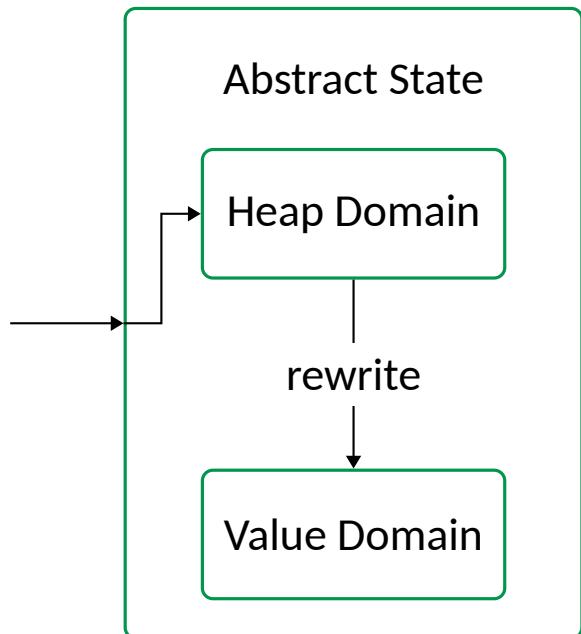


configurable

expression	variable	precision		
		low	medium	high
<code>new Foo()</code>	A_1	L	L_1	L_1
<code>x.f</code>	A_2	L	L_1	$L_{1.1}$
<code>x.g</code>	A_3	L	L_1	$L_{1.2}$

The Abstract State

[Fer16]

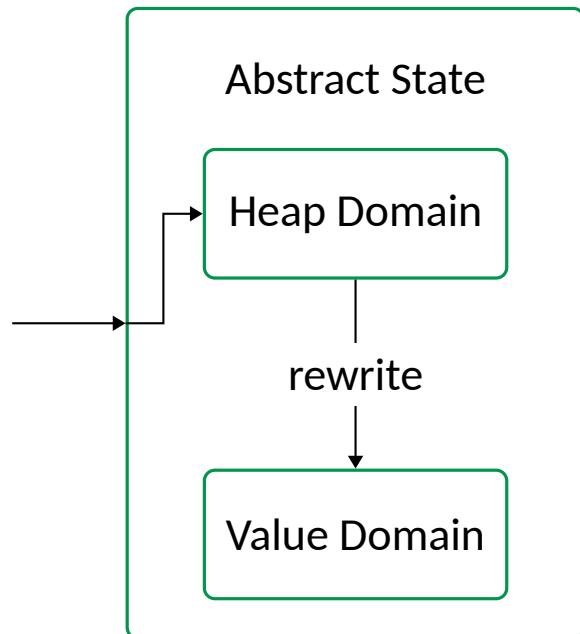


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expression	variable	precision		
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The Abstract State

[Fer16]

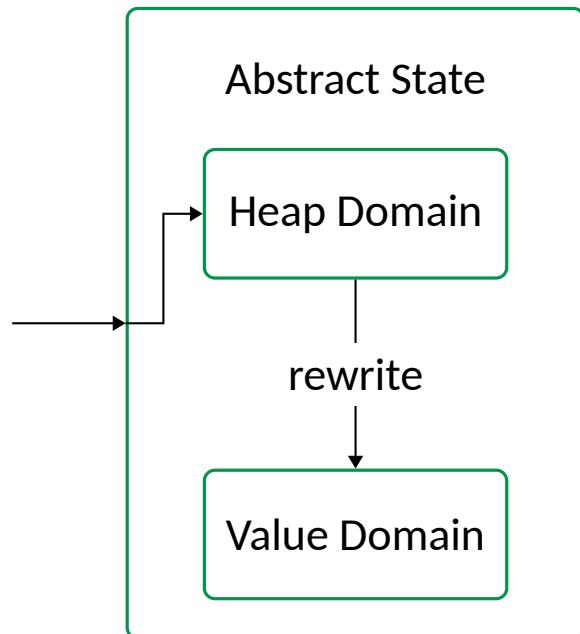


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The Abstract State

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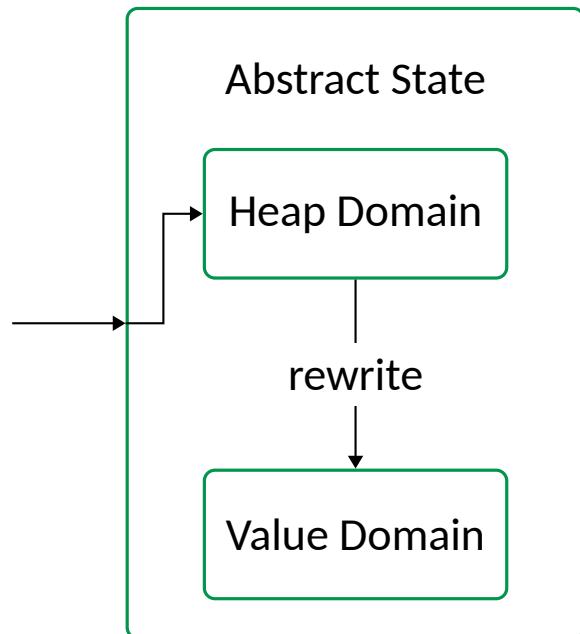


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The Abstract State

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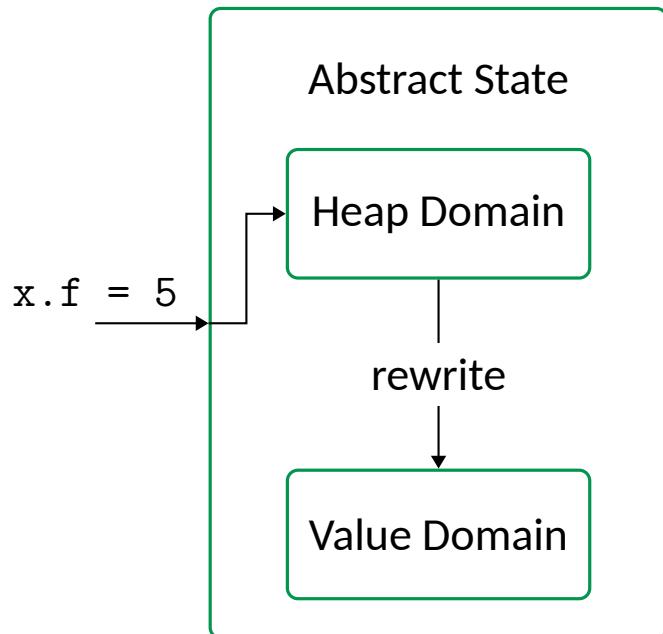
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Heap Domain: $x \mapsto L_1$

Value Domain:

The Abstract State

[Fer16]



configurable

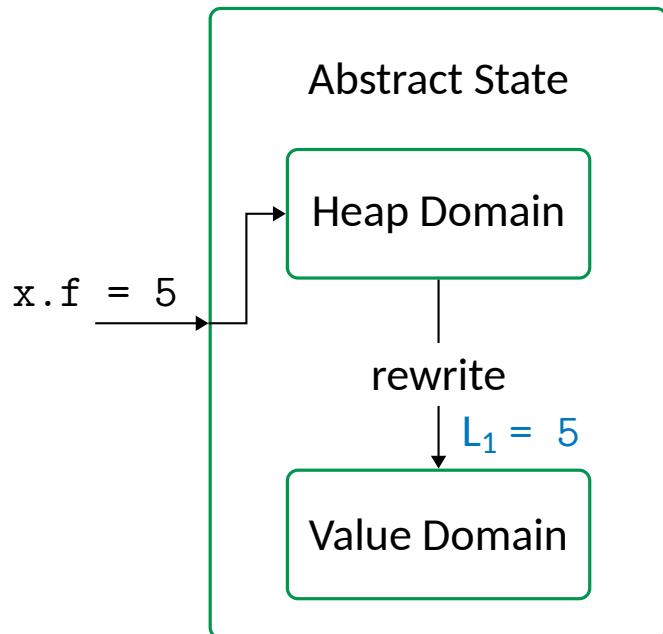
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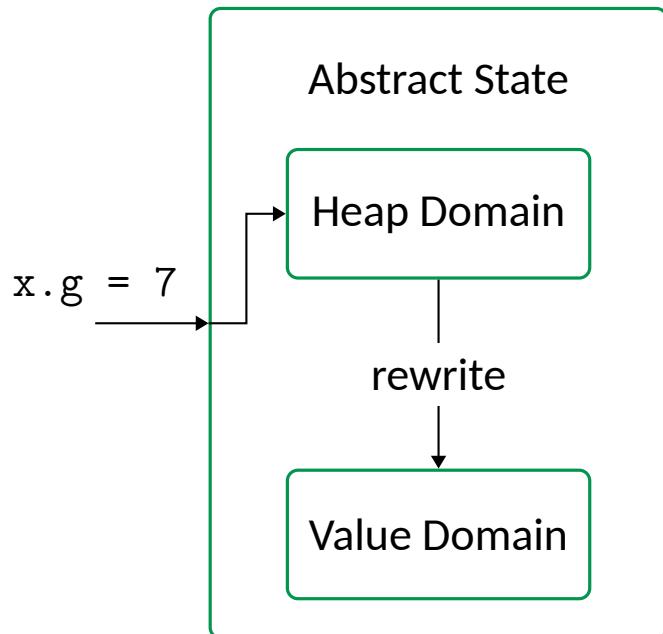
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Value Domain: $L_1 \mapsto \{5\}$

The Abstract State

[Fer16]



configurable

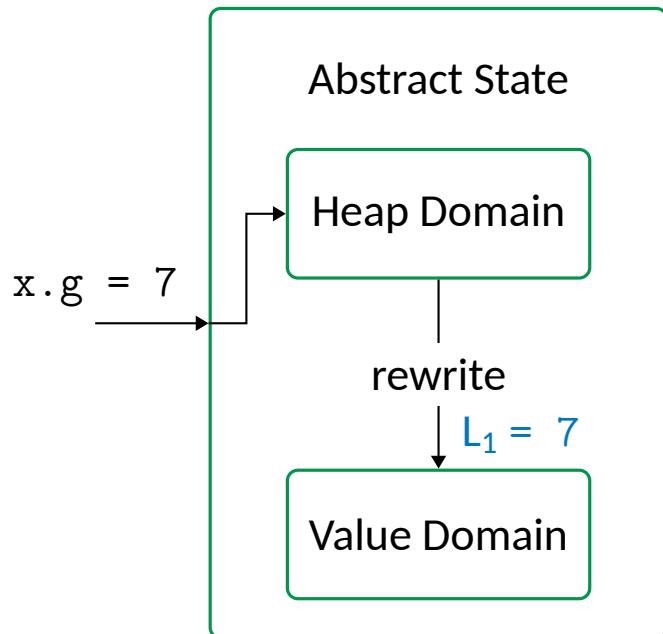
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The Abstract State

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□ configurable

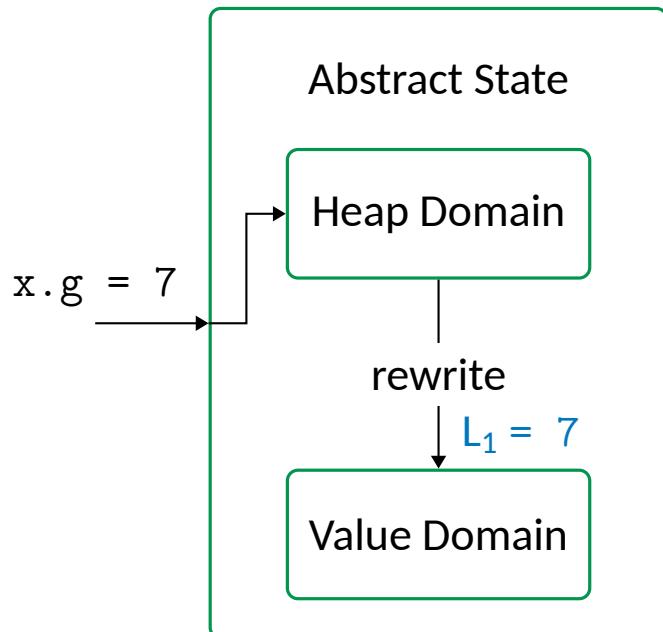
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Heap Domain: $x \mapsto L_1$

Value Domain: $L_1 \mapsto \{5, 7\}$

The Abstract State

[Fer16]



□ configurable

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Heap Domain: $x \mapsto L_1$

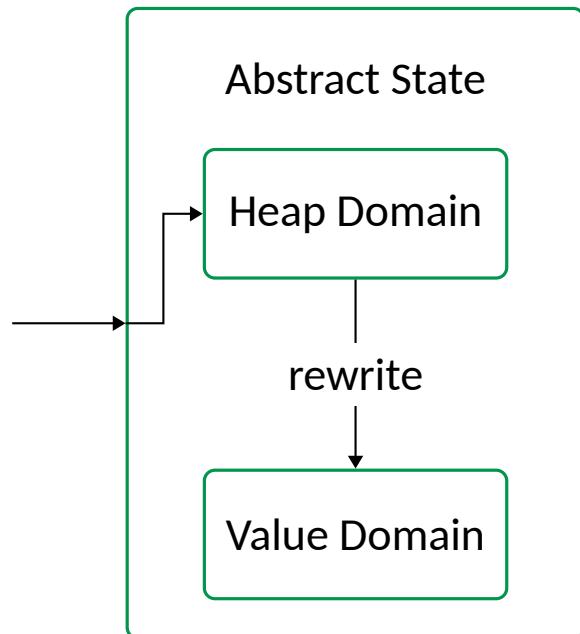
Value Domain: $L_1 \mapsto \{5, 7\}$

L_1 is assigned twice, so we lost precision!

Can we do better?

The Abstract State

[Fer16]



configurable

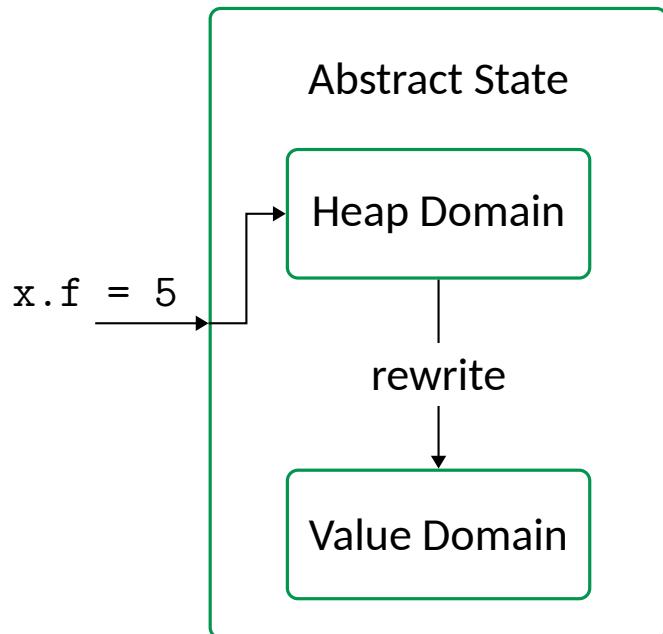
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Heap Domain: $x \mapsto L_1$

Value Domain:

The Abstract State

[Fer16]



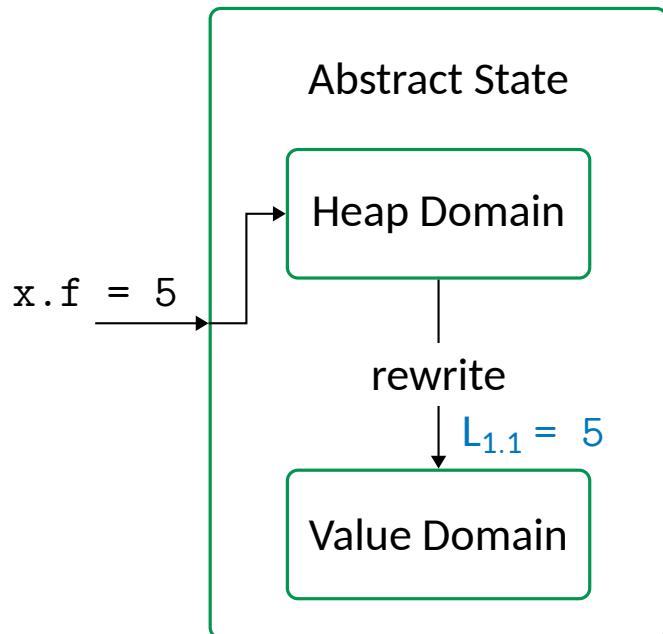
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Heap Domain: $x \mapsto L_1$
Value Domain:

configurable

The Abstract State

[Fer16]



□ configurable

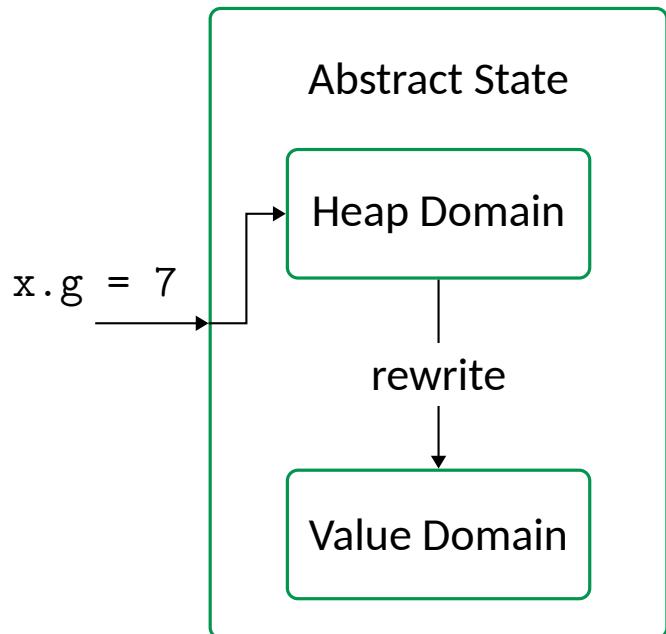
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Heap Domain: $x \mapsto L_1$

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The Abstract State

[Fer16]



configurable

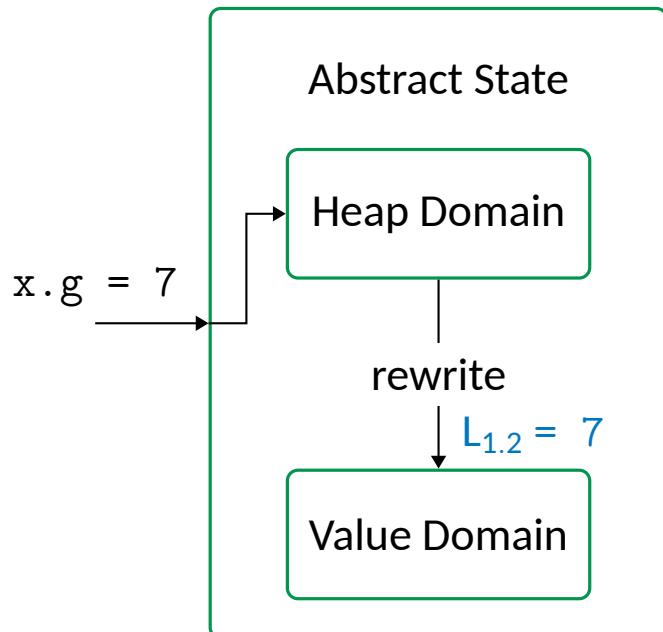
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The Abstract State

[Fer16]



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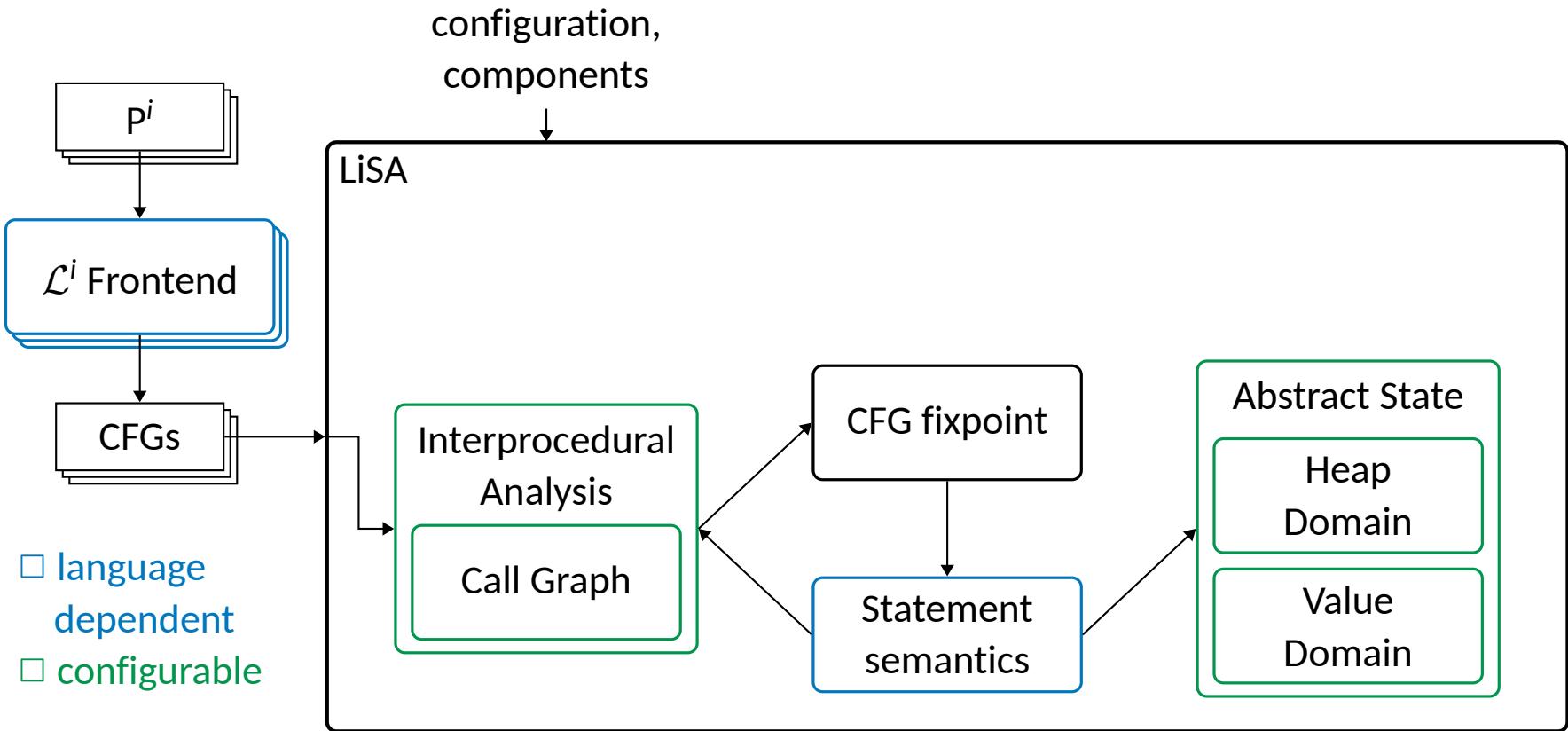
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Heap Domain: $x \mapsto L_1$

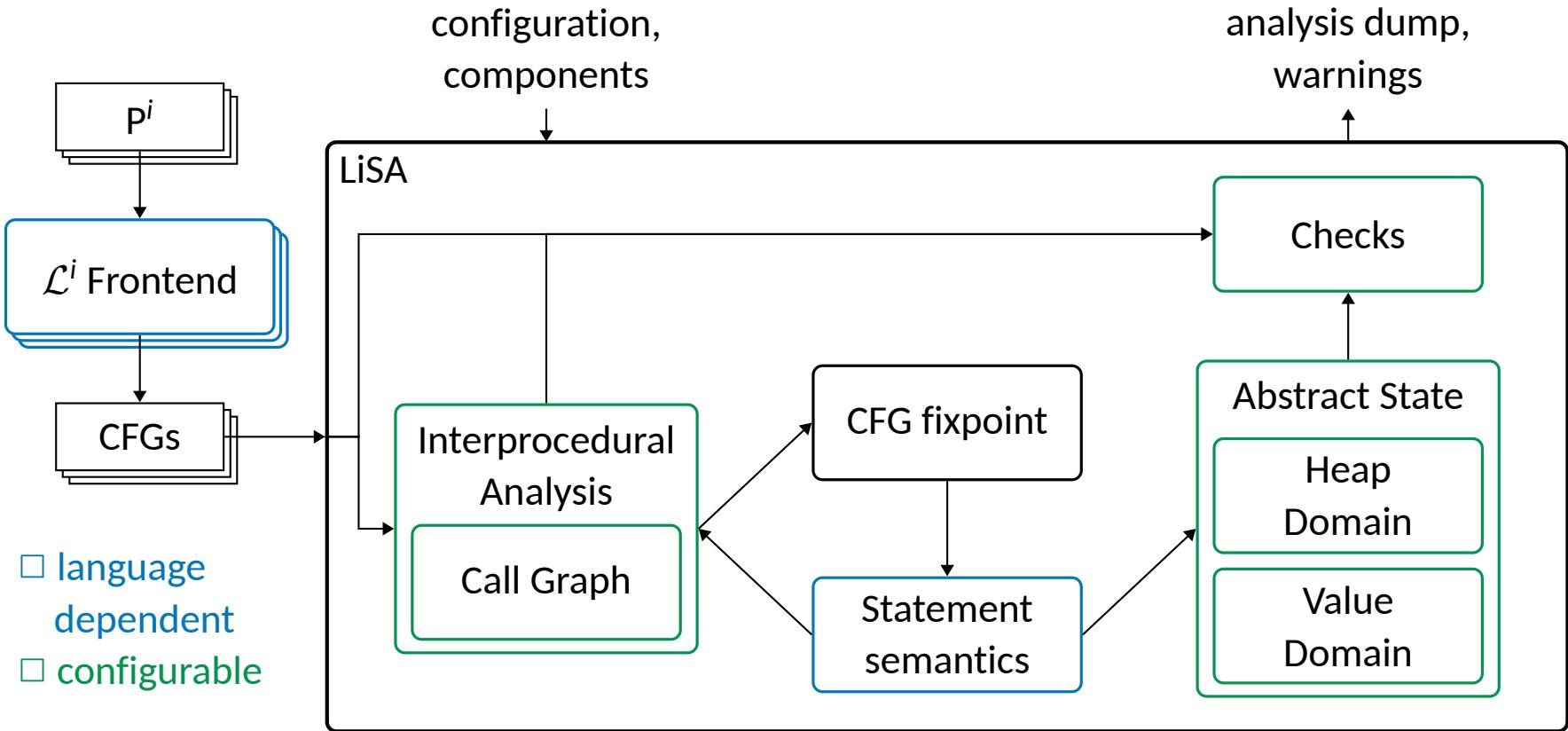
Value Domain: $L_{1.1} \mapsto \{5\}, L_{1.2} \mapsto \{7\}$

$L_{1.1}$ and $L_{1.2}$ are assigned once each, so we are more precise without changing the Value Domain!

LiSA Overview



LiSA Overview



Today's Plan

1. Components of a Static Analyzer

2. LiSA: a Library for Static Analysis

3. LiSA's High-Level Architecture

 3.1 Call resolution and evaluation

 3.2 Statement rewriting

 3.3 Memory and Value abstractions

4. Putting it Into Code

 4.1 The Signs Domain

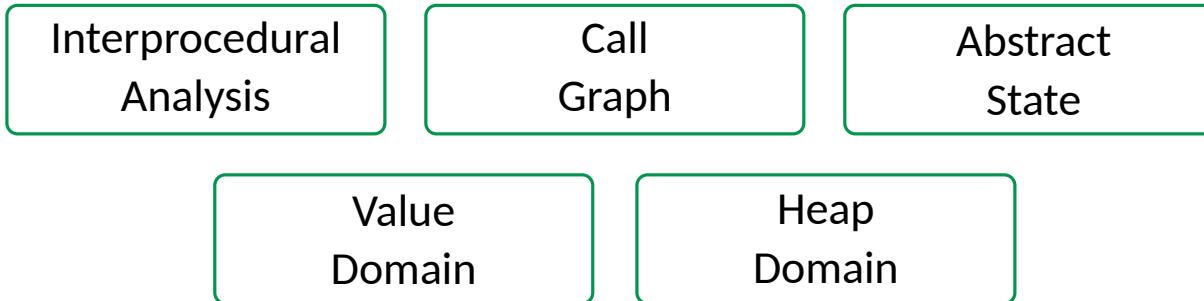
 4.2 The Intervals Domain

 4.3 The Upper Bounds Domain

 4.4 The Pentagons Domain

 4.5 Information flow: the Taint analysis

Configuring Analysis Components



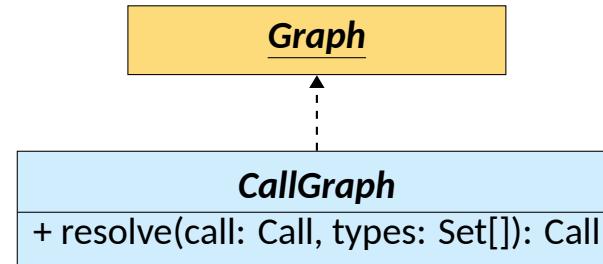
Configurable components can be passed to the engine modularly

They are defined as **interfaces** ■ or **abstract classes** ■ whose instances provide specific logic

Calls and Program Fixpoint

Both components are **analysis independent**

<i>InterproceduralAnalysis</i> : A
+ fixpoint(entryState: A): void
+ getAbstractResultOf(call: Call, entryState: A, parameters: SymbExpr[]): A
+ getAnalysisResultsOf(cfg: CFG): AnalyzedCFG[]

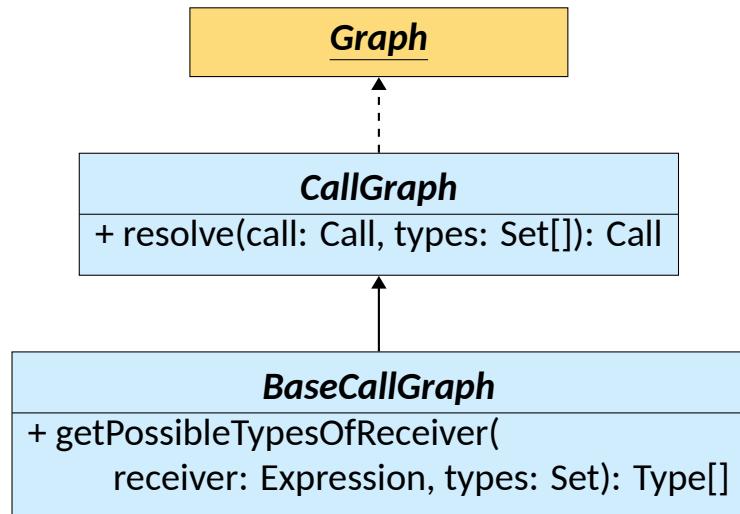


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Abstract States

Abstract states must be built, merged, and compared during the fixpoint

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Lattice : L

- + lessOrEqual(other: L): boolean
- + lub(other: L): L
- + widening(other: L): L
- + top(): L
- + bottom(): L

SemanticDomain : D

- + assign(id: ID, expression: SymbExpr): D
- + smallStepSemantics(expression: SymbExpr): D
- + satisfies(expression: SymbExpr): Satisfiability
- + assume(expression: SymbExpr): D

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- + smallStepSemantics(expression: SymbExpr): D
- + satisfies(expression: SymbExpr): Satisfiability
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Abstract State, Value Domain, and Heap Domain all implement both!

Examples (Less Pseudocode)

```
1 Plus.semantics(): // left + right
2   if type(left) is string or type(right) is string:
3     return domain.smallStepSemantics(new BinaryExpression("cat", left, right))
4   else:
5     return domain.smallStepSemantics(new BinaryExpression("+", left, right))
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```
1 Conditional.semantics(): // condition ? ifTrue : iffFalse
2   sat = domain.satisfies(condition)
3   tt = domain.assume(condition).smallStepSemantics(ifTrue)
4   ff = domain.assume(condition.negate()).smallStepSemantics(iffFalse)
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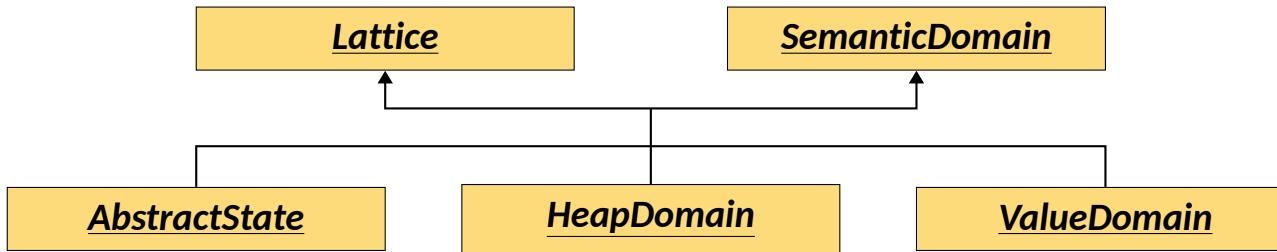
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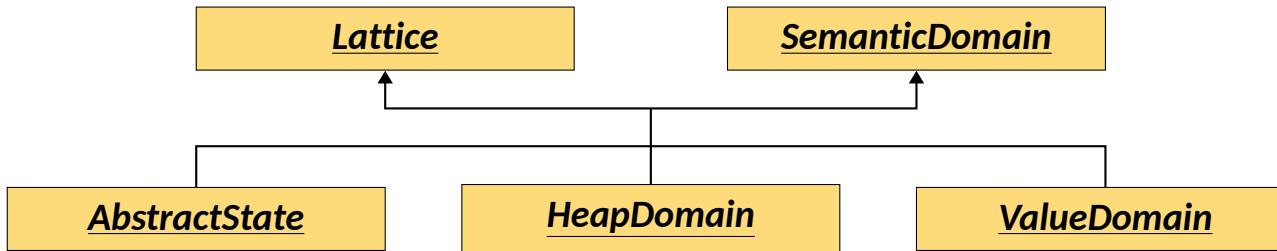
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```

```
1 PreIncrement.semantics(): // ++var
2   add = new BinaryExpression("+", var, new Const(1))
3   d1 = domain.assign(var, add)
4   return d1.smallStepSemantics(var)
```

Abstract State, Heap and Value Domain



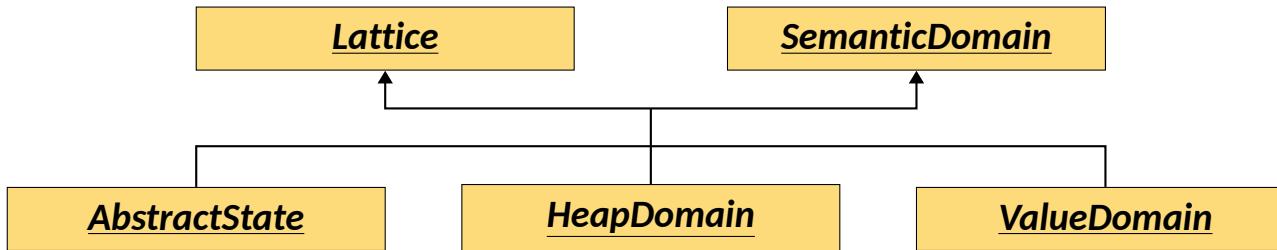
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Each instance is a **lattice element**:

- Its state carries the abstract information
- Lattice operators compare/combine that information

Abstract State, Heap and Value Domain



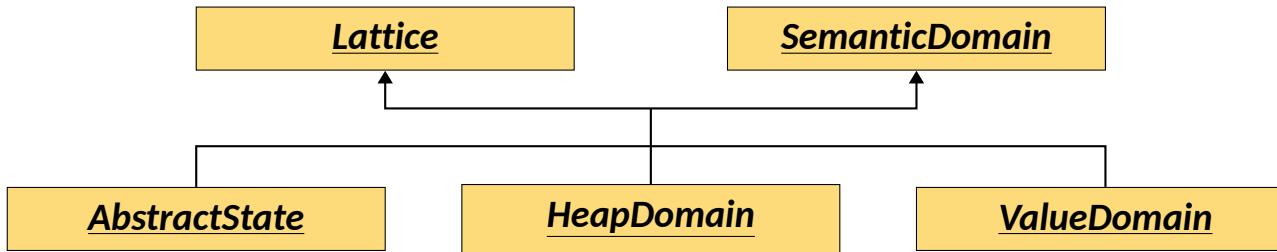
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Can we further modularize?

Relational vs Non-Relational

Relational analyses have [specific structures](#)

- Hard to factor out general implementation patterns

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Non-relational analyses instead share a common structure:

- Track values of single variables through a **function** (i.e., a map)
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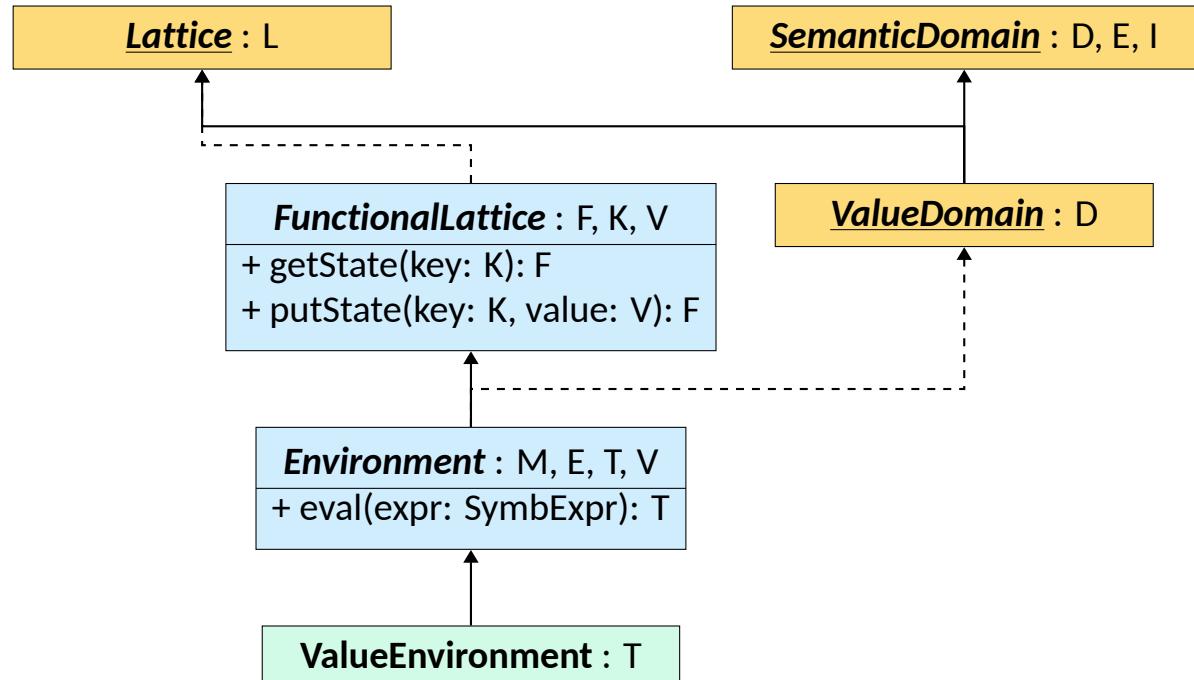
There is space for modularization!

- Abstract common logic (map and assignment)
- Build instances of atomic information with domain-specific logic

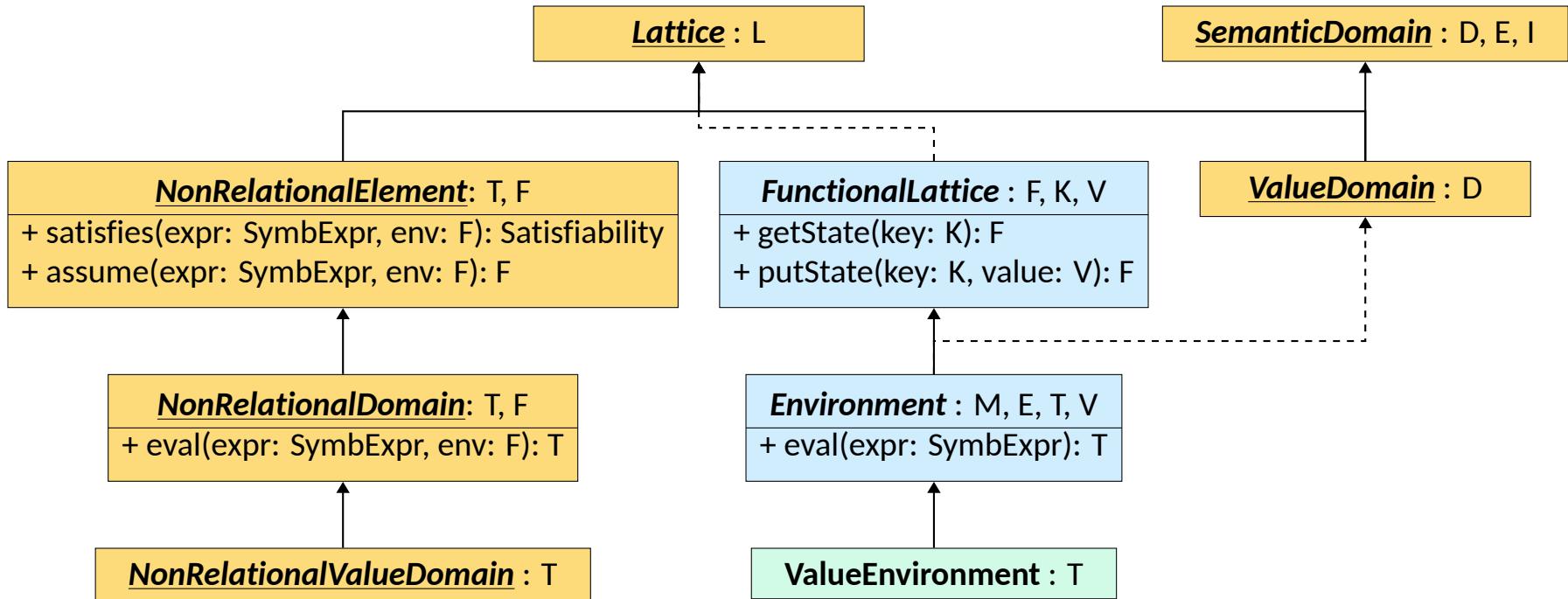
Main Classes for Value Analyses



Main Classes for Value Analyses

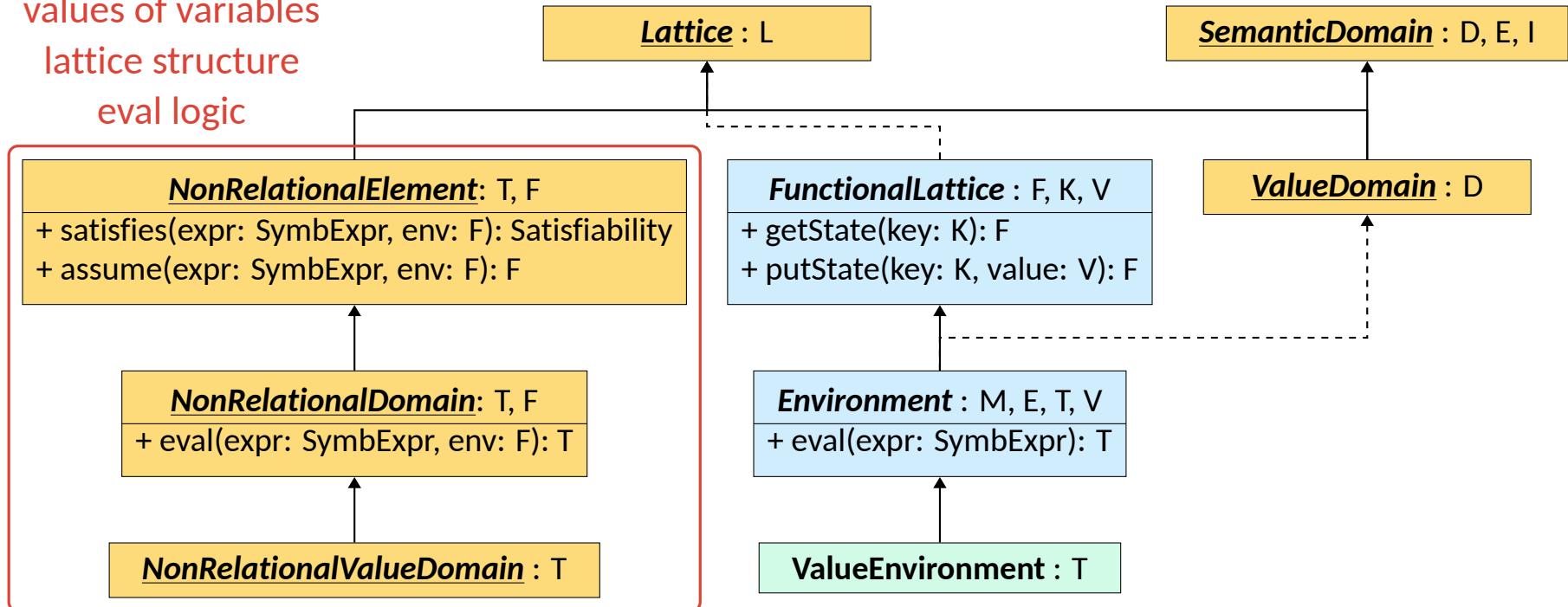


Main Classes for Value Analyses

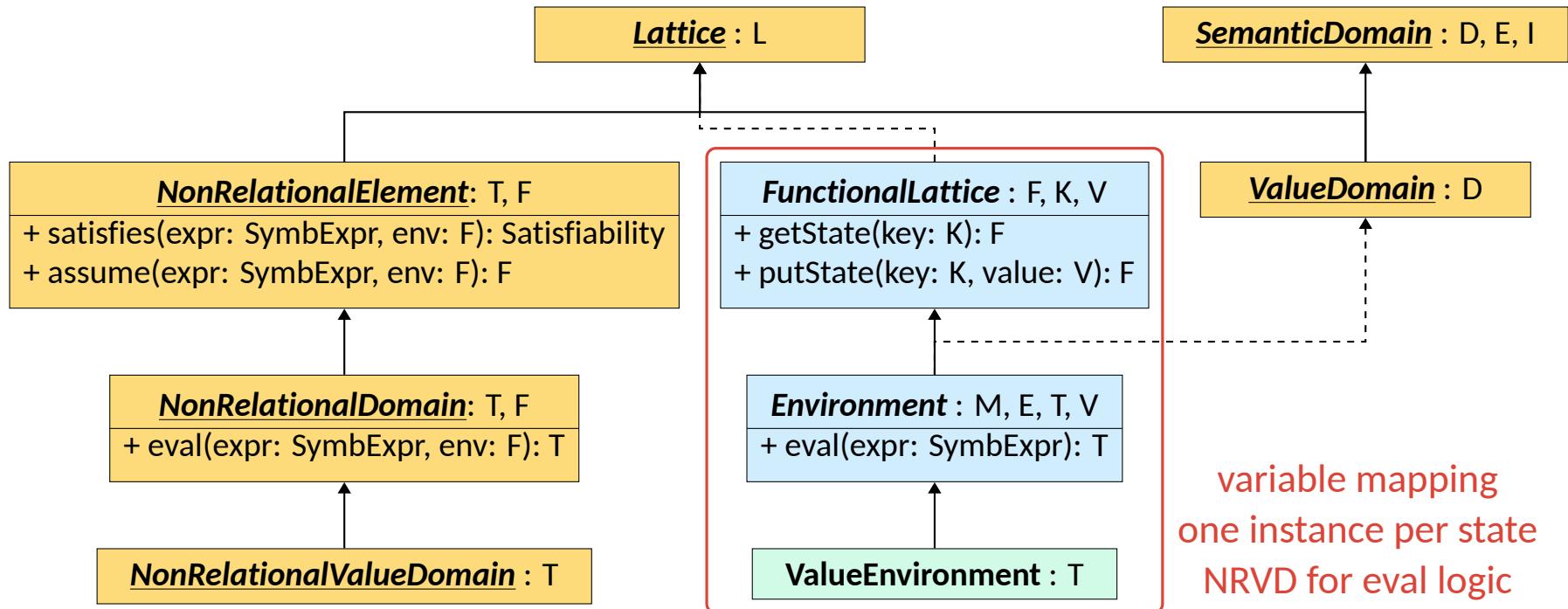


Main Classes for Value Analyses

values of variables
lattice structure
eval logic



Main Classes for Value Analyses



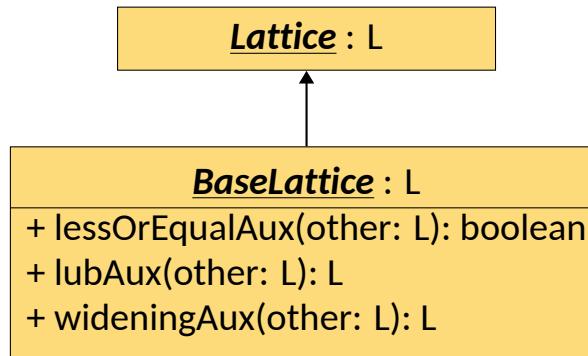
Easing Development: Lattice Functionalities

We can avoid coding **common lattice logic** and **standard lattice structures**

Lattice : L

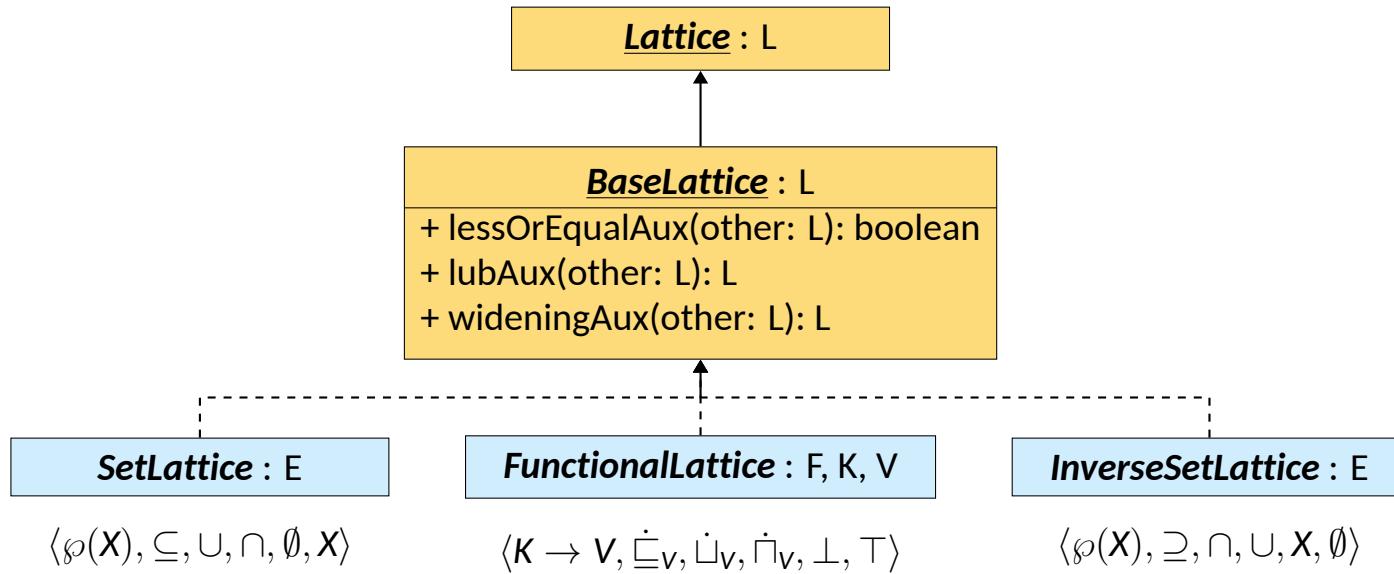
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Easing Development: Lattice Functionalities

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Easing Development: Recursive Evaluation

Interpreters evaluate expressions recursively:

$$\begin{array}{c} \frac{\llbracket x \rrbracket \{x \mapsto 7, y \mapsto 3\} = 7}{\llbracket x * 2 \rrbracket \{x \mapsto 7, y \mapsto 3\} = 14} \quad \llbracket y \rrbracket \{x \mapsto 7, y \mapsto 3\} = 3} \\ \hline \llbracket x * 2 + y \rrbracket \{x \mapsto 7, y \mapsto 3\} = 17 \\ \hline \llbracket x = x * 2 + y \rrbracket \{x \mapsto 7, y \mapsto 3\} = \{x \mapsto 17, y \mapsto 3\} \end{array}$$

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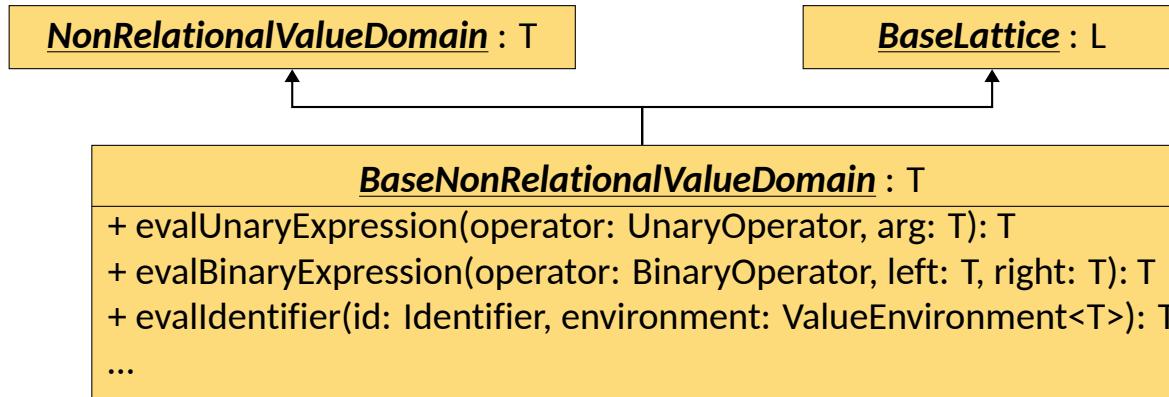
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Symbolic Expressions implement the **visitor pattern** to ease recursive traversal:

```
1 public <T> T accept(ExpressionVisitor<T> visitor, Object... params) {  
2     T left = this.left.accept(visitor, params);  
3     T right = this.right.accept(visitor, params);  
4     return visitor.visit(this, left, right, params);  
5 }
```

Easing Development: Recursive Evaluation

BaseNonRelationalValueDomain is an ExpressionVisitor:



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2. LiSA: a Library for Static Analysis

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4. Putting it Into Code

 4.1 The Signs Domain

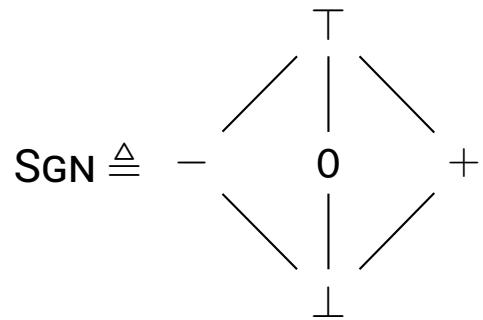
 4.2 The Intervals Domain

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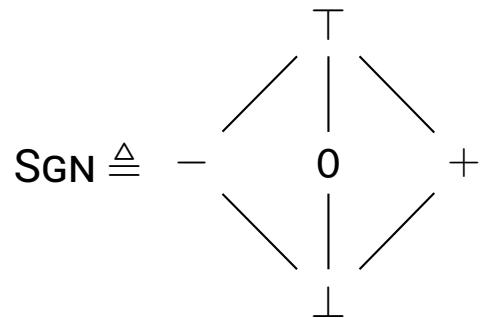
The Signs Domain



$$\text{SIGN} \triangleq \langle \text{ID} \rightarrow \text{SGN}, \dot{\sqsubseteq}, \dot{\sqcup}, \dot{\sqcap}, \perp, \top \rangle$$

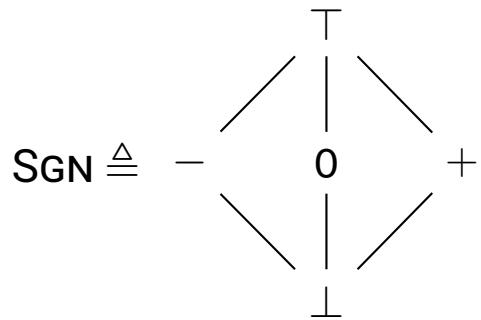
The Signs Domain

SIGN is a value domain



$$\text{SIGN} \triangleq \langle \text{ID} \rightarrow \text{SGN}, \dot{\sqsubseteq}, \dot{\sqcup}, \dot{\sqcap}, \perp, \top \rangle$$

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SIGN is a value domain

SIGN is non relational

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The Signs Domain

$$\text{SGN} \triangleq - \begin{array}{c} \diagup \quad \diagdown \\ \text{0} \end{array} + \begin{array}{c} \diagup \quad \diagdown \\ \perp \end{array}$$

$$\text{SIGN} \triangleq \langle \text{ID} \rightarrow \text{SGN}, \dot{\sqsubseteq}, \dot{\sqcup}, \dot{\sqcap}, \perp, \top \rangle$$

SIGN is a value domain

SIGN is non relational

We implement it as a NonRelationalValueDomain

- ▷ A single class for SGN
 - Lattice operators for SGN
 - Evaluation logic combining SGN instances
 - Can use Base interface to simplify evaluation
- ▷ ValueEnvironment manages lifting and assignments

Environment's Assign (Simplified)

```
1 public ValueEnvironment<T> assign(Identifier id, ValueExpression expression) {  
2     if (isBottom())  
3         // bottom values are preserved  
4         return (M) this;  
5  
6     Map<Identifier, T> func = this.function.clone();  
7     T value = lattice.eval(expression, this);  
8  
9     if (id.isWeak() && this.function.containsKey(id))  
10        // if we have a weak identifier for which we already have  
11        // information, we perform a weak assignment  
12        value = value.lub(getState(id));  
13  
14    func.put(id, value);  
15    return new ValueEnvironment<>(lattice, func);  
16 }
```

[Link to assign's implementation](#)

Signs' Implementation

[Link to full Signs implementation](#) (220 lines, 178 containing code)

Methods implemented:

- constructors, equals() and hashCode()
- top() and bottom() to retrieve the respective lattice elements (if these do not return a constant value, isTop() and isBottom() also **have to be implemented**)
- lessOrEqualsAux() and lubAux() for lattice operators
- evalNonNullConstant(), evalUnaryExpression(), and evalBinaryExpression() to evaluate expressions
- representation() to dump SIGN instances in various formats

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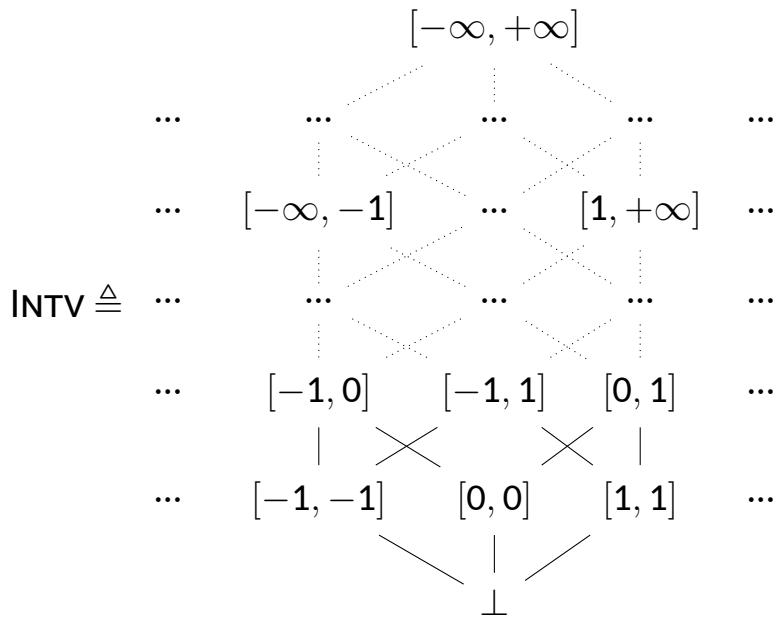
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The Intervals Domain

[CC77]



$$\text{INTERVAL} \triangleq \langle \text{ID} \rightarrow \text{INTV}, \dot{\sqsubseteq}, \dot{\sqcup}, \dot{\sqcap}, \perp, \top \rangle$$

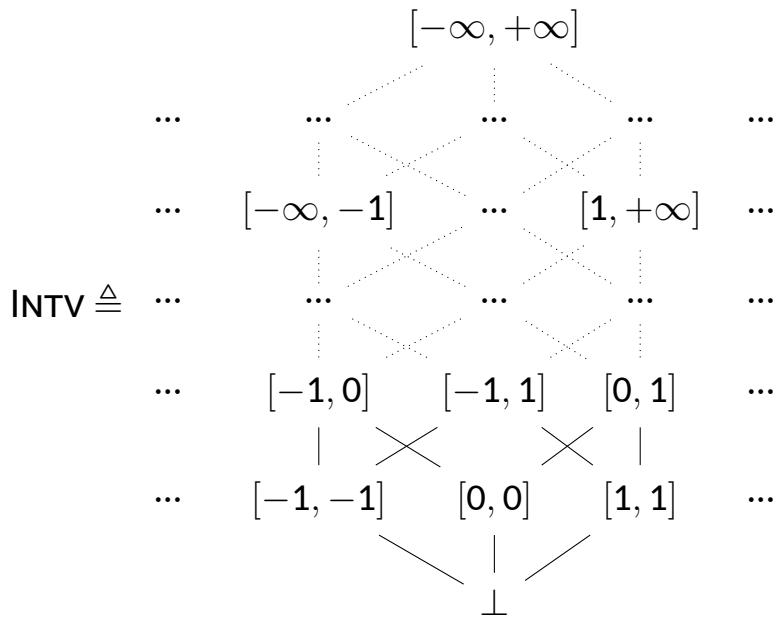
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The Intervals Domain

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INTERVAL is a value domain

INTERVAL is non relational

We implement it as a
NonRelationalValueDomain

- ▷ Same as SIGN and SGN, but
 - We need the widening and glb as well
 - We add assume() and satisfies()

Intervals' Implementation

[Link to full Intervals implementation](#) (357 lines, 294 containing code)

Methods implemented:

- constructors, equals() and hashCode()
- all methods of Signs
- glbAux() and wideningAux() for lattice operators
- satisfiesBinaryExpression() to test whether an expression is satisfied
- assumeBinaryExpression() to refine environments when traversing a condition

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The Upper Bounds Domain

[LF10]

The domain of Upper Bounds keep tracks of relations of the form $x < y$

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Despite this, it has a convenient non-relational-like representation:

$$\left\{ \begin{array}{l} x \mapsto \{y, z\} \\ z \mapsto \{w\} \end{array} \right\} \implies \begin{array}{l} x < y \wedge x < z \\ z < w \end{array}$$

Values of the function are sets in $\wp(\text{ID})$ with operators \supseteq, \cap, \cup , forming an inverse set lattice

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Values of the function are sets in $\wp(\text{ID})$ with operators \supseteq, \cap, \cup , forming an **inverse set lattice**

But the domain is relational: we cannot implement $\mathbb{S}^\sharp[\![x = \bullet]\!]$ since we have to **clean up** occurrences of x

Upper Bounds' Implementation

[Link to full Upper Bounds implementation](#) (326 lines, 235 containing code)

IdSet as an InverseSetLattice to hold sets of variables

- Lattice operators for free, except wideningAux()

StrictUpperBounds as an Environment and a ValueDomain implementing:

- constructors
- assign() to cleanup invalid bounds and add new ones
- smallStepSemantics() as a no-op
- satisfies() to test whether an expression is satisfied
- assume() to add bounds when traversing a condition

Instead, equals(), hashCode(), and lattice operators are provided by Environment

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Products

A product is a **combination** of two or more analyses [CCF13]

- That run independently (i.e., a **Cartesian product**)
- That might exchange information (e.g., a **reduced** or **Granger product**)

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- That run independently (i.e., a **Cartesian product**)
- That might exchange information (e.g., a **reduced** or **Granger product**)

Regardless of the formalism, products in LiSA are just “**nested**” analyses

- You define the individual analyses beforehand
- You define the product as a new analysis that contains the client ones **in its state**
- Lattice operators and abstract transformers forward to nested analysis, with optional closures and refinements
- **This maintains modularity!**

The Pentagons Domain

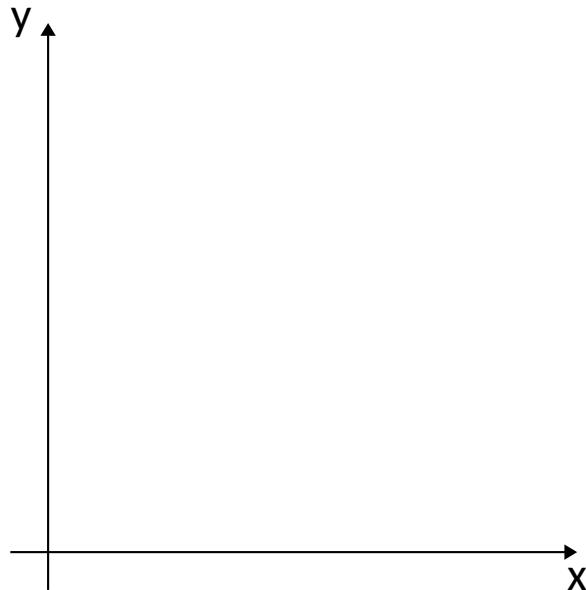
[LF10]

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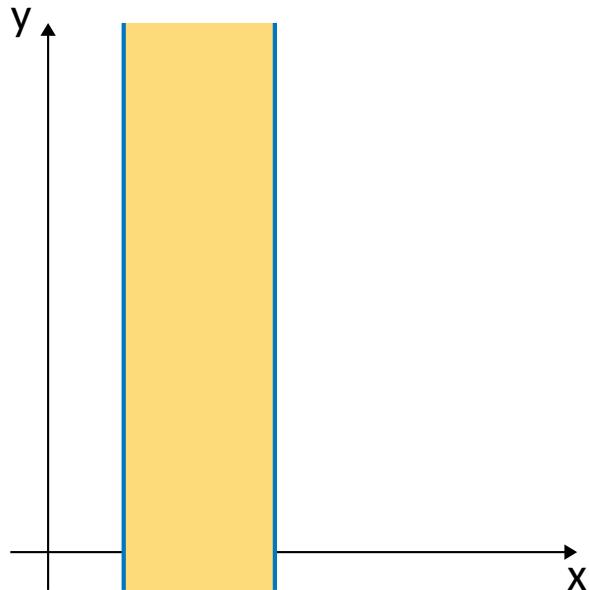
Intervals:

Upper Bounds:

The Pentagons Domain

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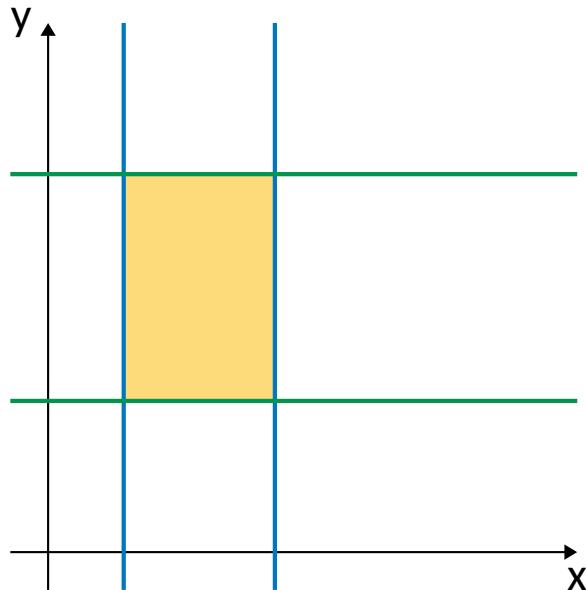
$$x \mapsto [3, 9]$$

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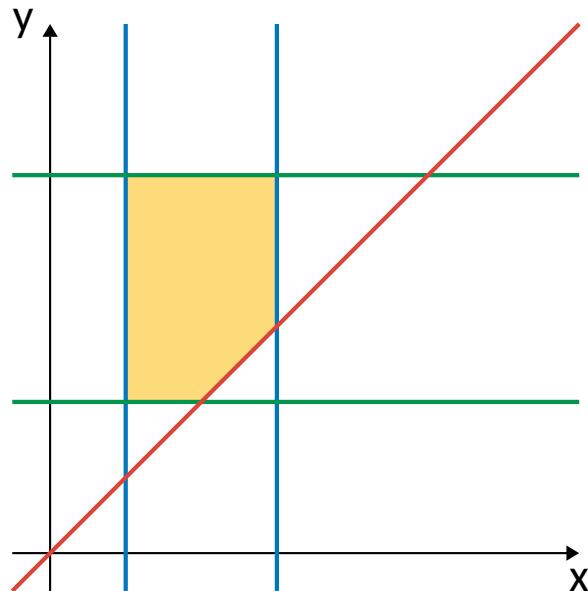
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Intervals:

$$x \mapsto [3, 9]$$

$$y \mapsto [6, 15]$$

Upper Bounds:

$$x \mapsto \{y\}$$

Pentagons' Implementation

[Link to full Pentagons implementation](#) (307 lines, 247 containing code)

Pentagons as ValueDomain implementing:

- constructors, equals(), and hashCode()
- top() and bottom() propagating the calls
- isTop() and isBottom() matching the respective implementations
- lessOrEqualsAux() and lubAux() perform closures, while wideningAux() is just forwarded
- assign(), smallStepSemantics(), satisfies(), and assume() propagate the calls to the underlying analyses
- assign() adds the semantics for a new assignment

The remaining methods are mostly forwarding calls, and are needed for infrastructural reasons

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Information Flow Analysis

Information Flow analyses aim at understanding how data flows from a location to another during the execution

- It does not care about values, but **how they are computed**

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Taint analysis is one instance of Information Flow that only considers explicit flows

- We mark relevant values as tainted
- We mark variables as tainted when they are assigned a tainted value
- After the analysis, we check where that taintedness reached

Example: SQL Injections

```
1 protected void doPost(HttpServletRequest request, HttpServletResponse response)
2     throws ServletException, IOException {
3     boolean success = false;
4     String username = request.getParameter("username");
5     String password = request.getParameter("password");
6     String query = "SELECT * FROM users WHERE username='"
7         + username
8         + "' and password='"
9         + password
10        + "'";
11
12    Statement stmt = null;
13    Connection conn = DriverManager.getConnection("jdbc:mysql://" + DB_URL,
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15    Statement stmt = conn.createStatement();
16    ResultSet rs = stmt.executeQuery(query);
17    // ...
18 }
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14                                              DB_USER, DB_PWD);
15    Statement stmt = conn.createStatement();
16    ResultSet rs = stmt.executeQuery(query); Security hotspot: no user input allowed!
17    // ...
18 }
```

Implementing Taint Analysis

Taint analysis can be implemented in different ways (e.g., boolean formulas [SBE⁺19])

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We implement it as a **non-relational domain**:

- One bit of taintedness per variable
- Taintedness is propagated from one variable to another on assignments only

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|

We will use **annotations** for detecting sources

After the analysis, we will run a **semantic check** to find dangerous sinks

Taint's Implementation

[Link to full Taint implementation](#) (231 lines, 162 containing code)

[Link to full Semantic Check implementation](#) (123 lines, 84 containing code)

Taint as BaseNonRelationalValueDomain implementing:

- constructors, equals(), and hashCode()
- same lattice operators of Signs and Intervals
- evalIdentifier() looks at the identifier's annotations before looking inside the mapping
- other evalX() methods return the lub of the operands

TaintCheck as SemanticCheck inspecting each Statement:

- it skips everything that is not a call
- it checks parameters of each call for the sink annotation
- it issues warnings if a sink is reached by a tainted value

Thanks!

luca.negrini@unive.it • LiSA on GitHub • Today's code



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