

# Incremental Static Analysis

Sebastian Erdweg

Joint work with Tamás Szabó, Gábor Bergmann, Markus Voelter

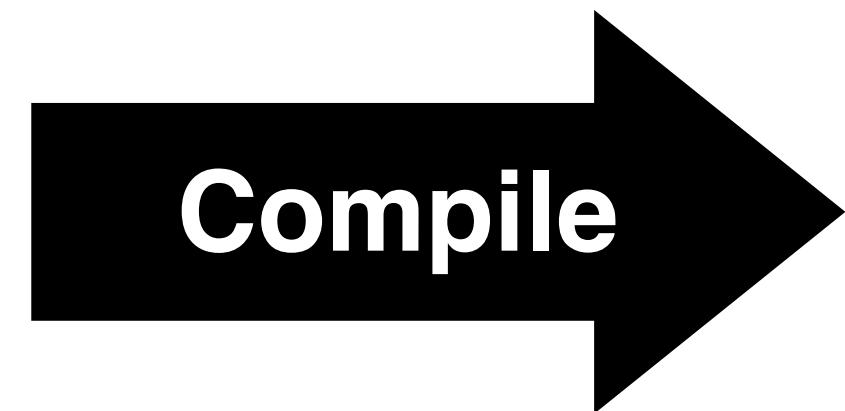
**Source code**



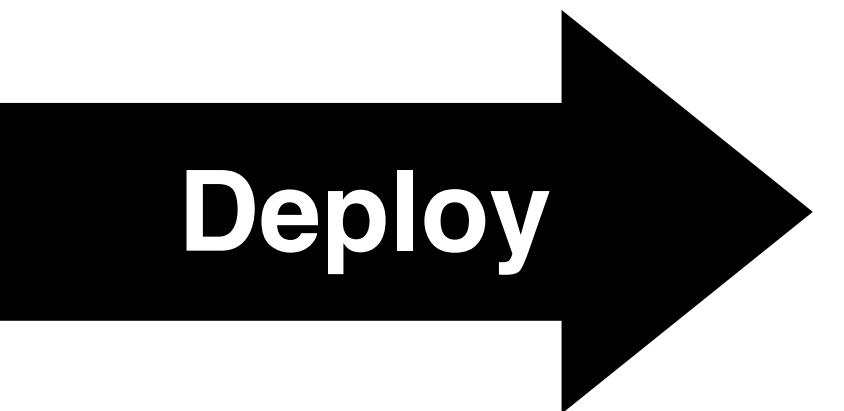
**Binary**



**Compile**



**Deploy**

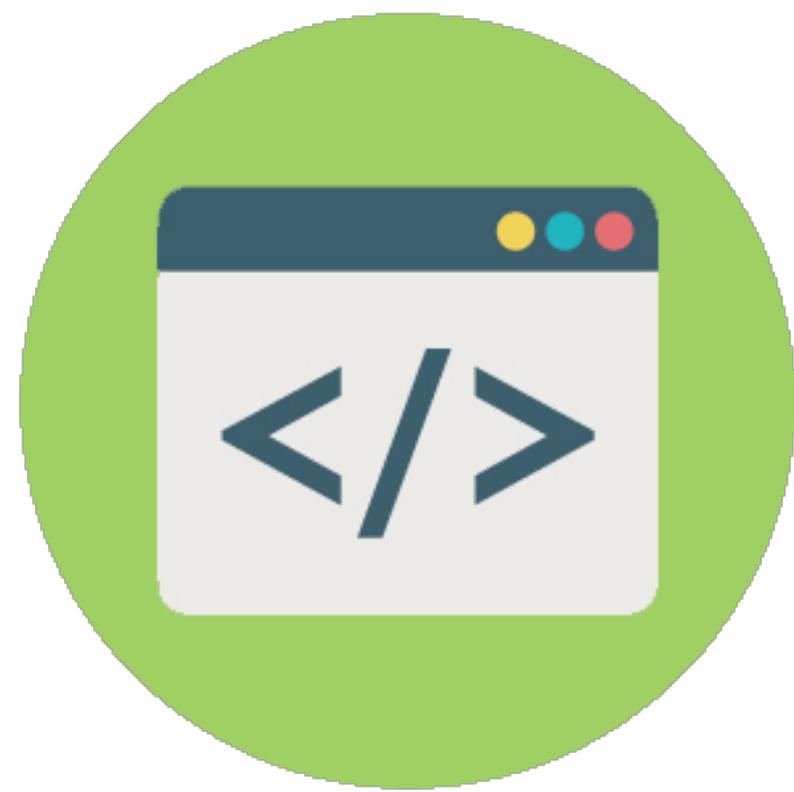


**Customer /  
Production**



**Failure**

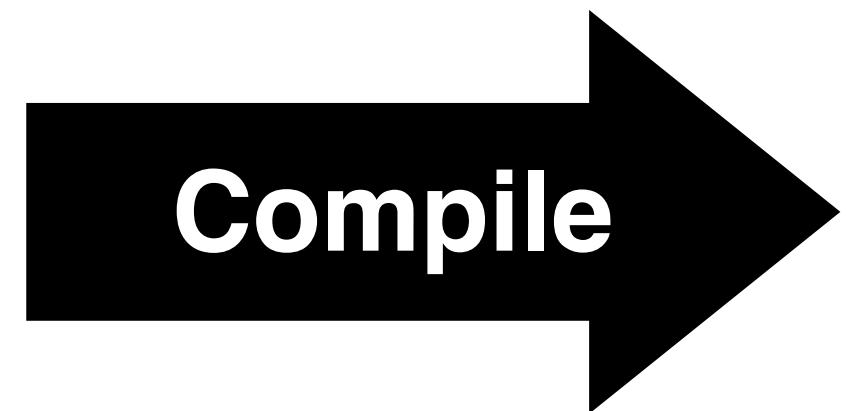
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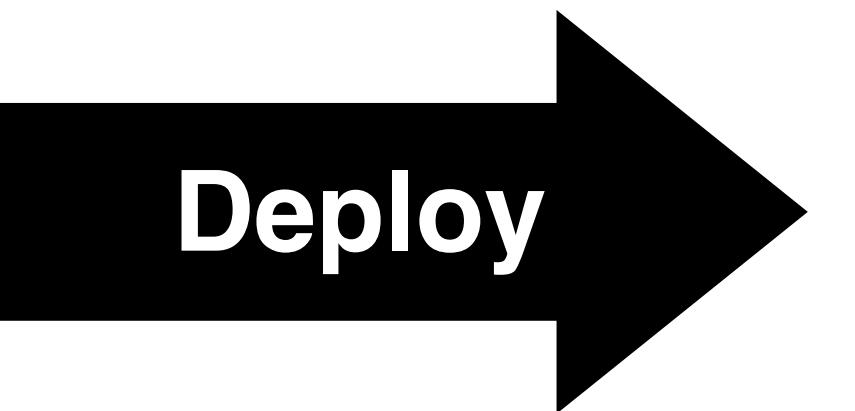
**Binary**



**Compile**



**Deploy**



**Customer /  
Production**



**Failure**

Source code



Binary



Compile

Deploy

Customer /  
Production



Failure

**Source code**



**Binary**



**Compile**

**Deploy**

**Customer /  
Production**



## **Research goal**

Protect developers from security vulnerabilities, unsafe code, performance bottlenecks, and specification violations

Source code



Binary



Compile

Deploy

Customer /  
Production



Failure

**Source code**



**Binary**



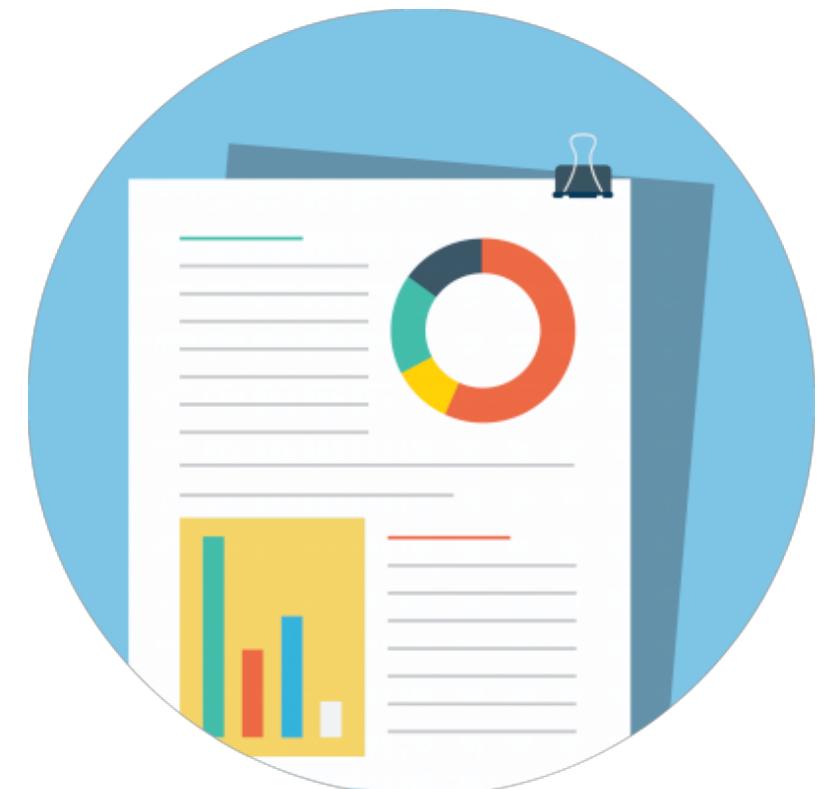
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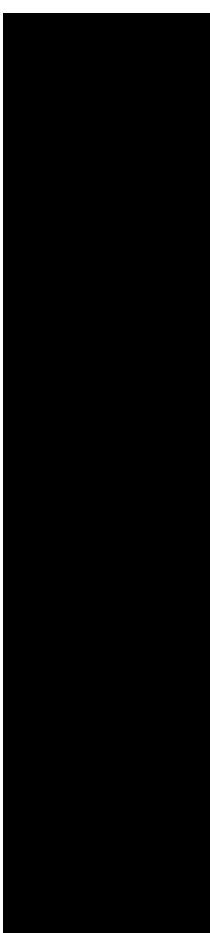
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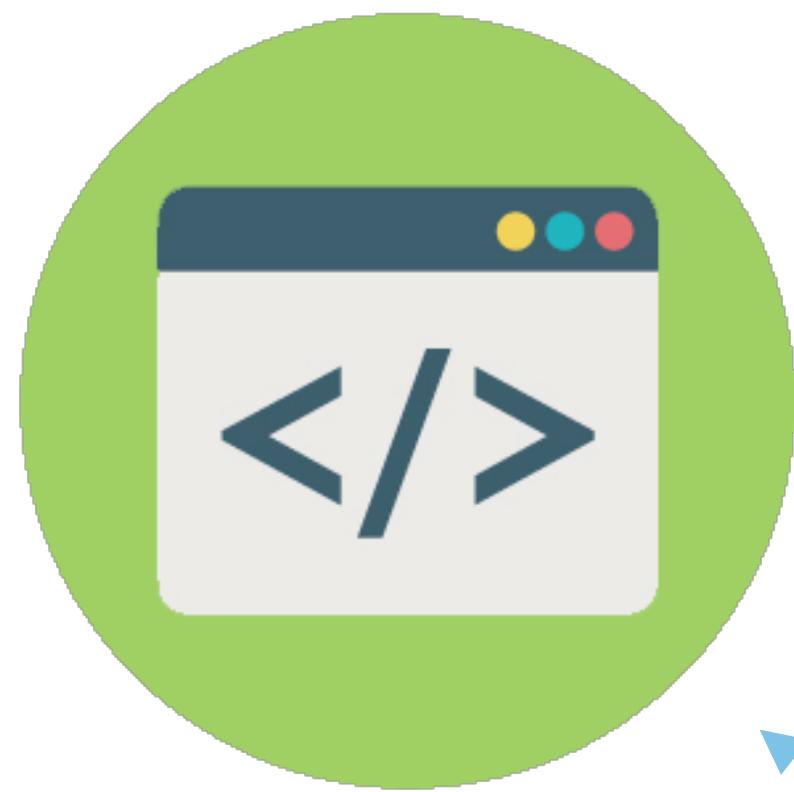
**Automated  
feedback**



**Program analysis**



**Source code**



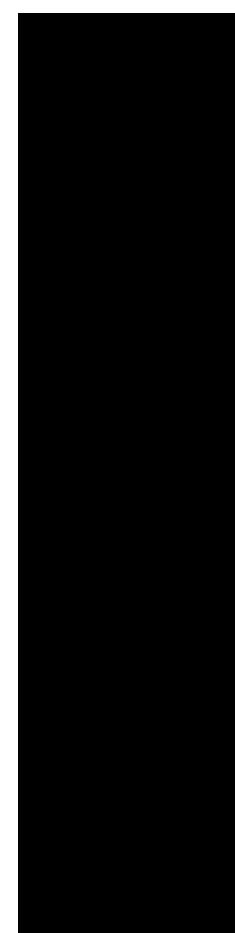
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**Compile**

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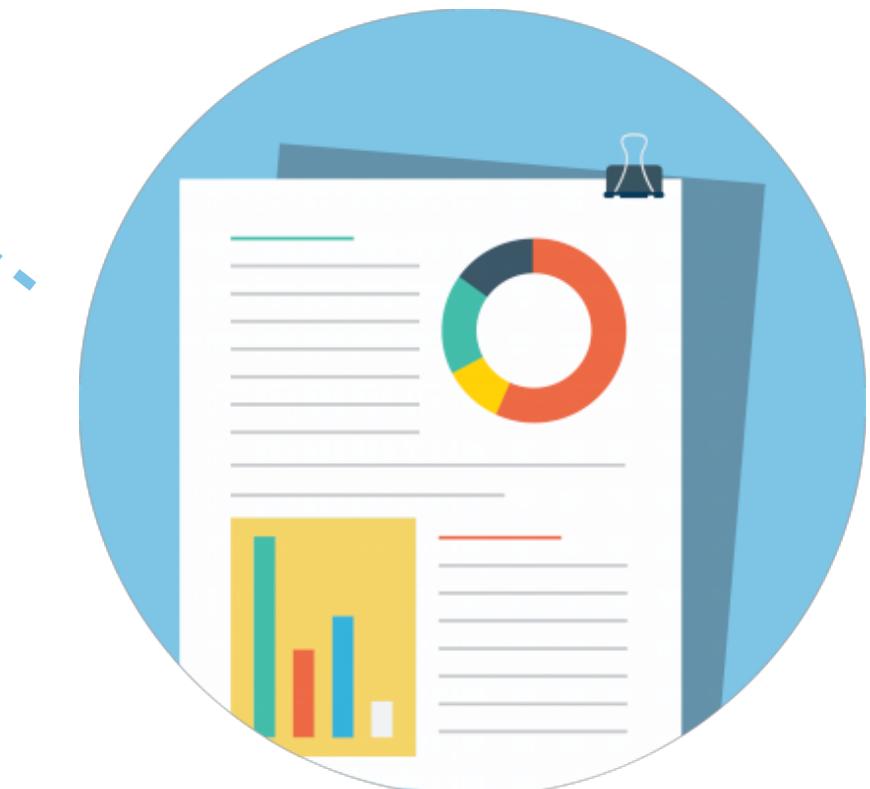
**Customer /  
Production**



**Program analysis**

*Improve*

**Automated  
feedback**

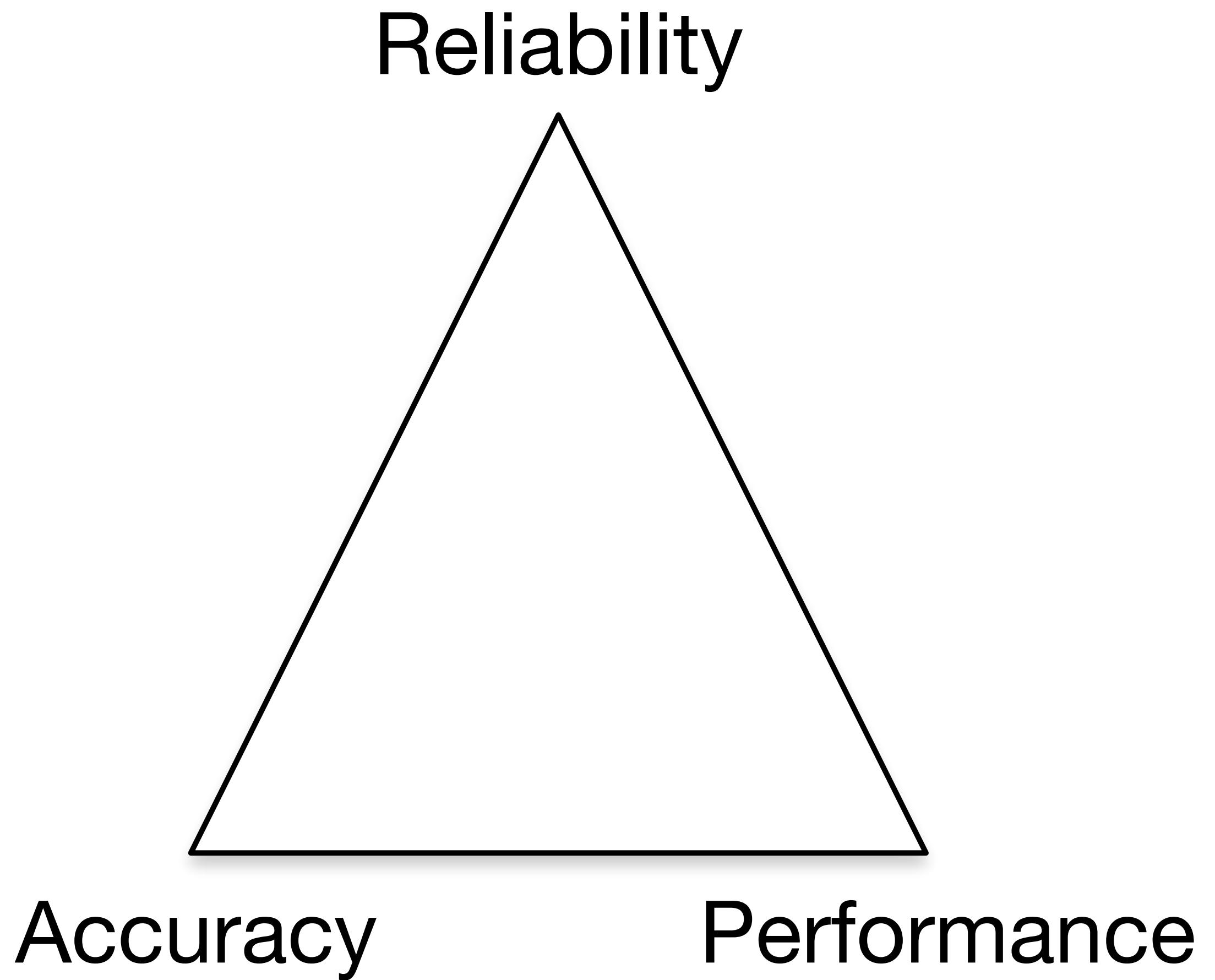


*Predicts failures*

**Failure**

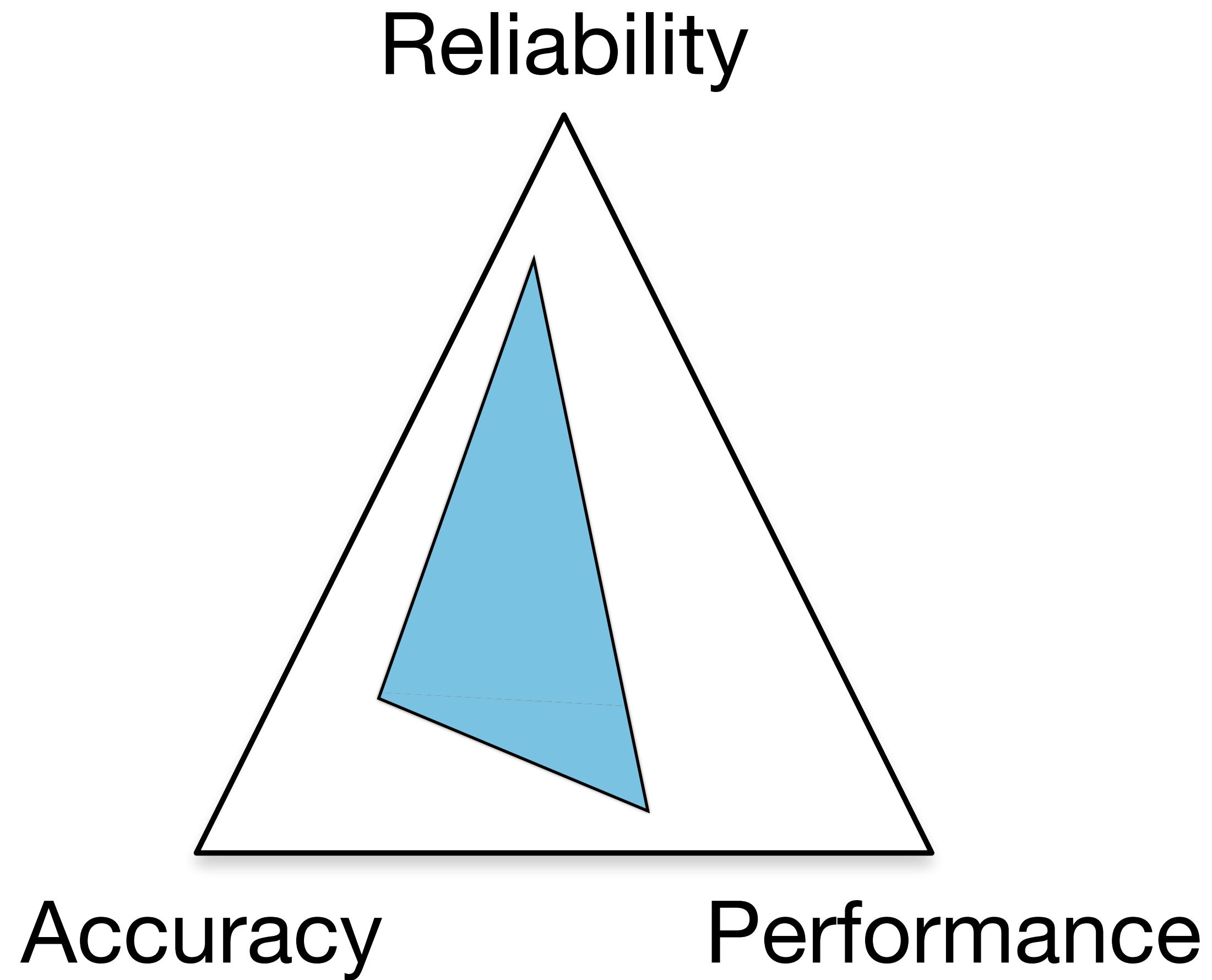
# Program analysis trade-offs

More reliability = less missed bugs  
More accuracy = less false alarms  
More performance = faster feedback



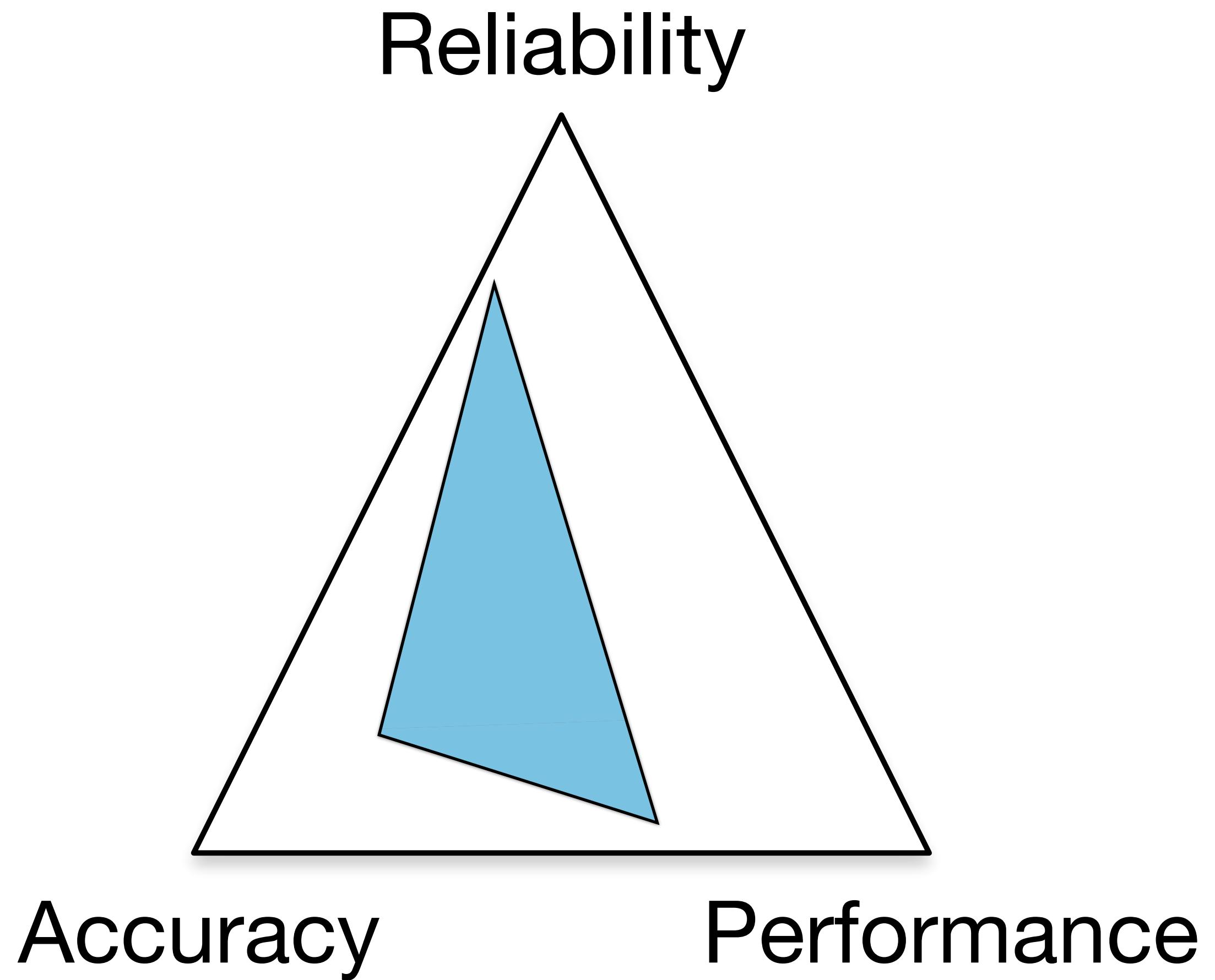
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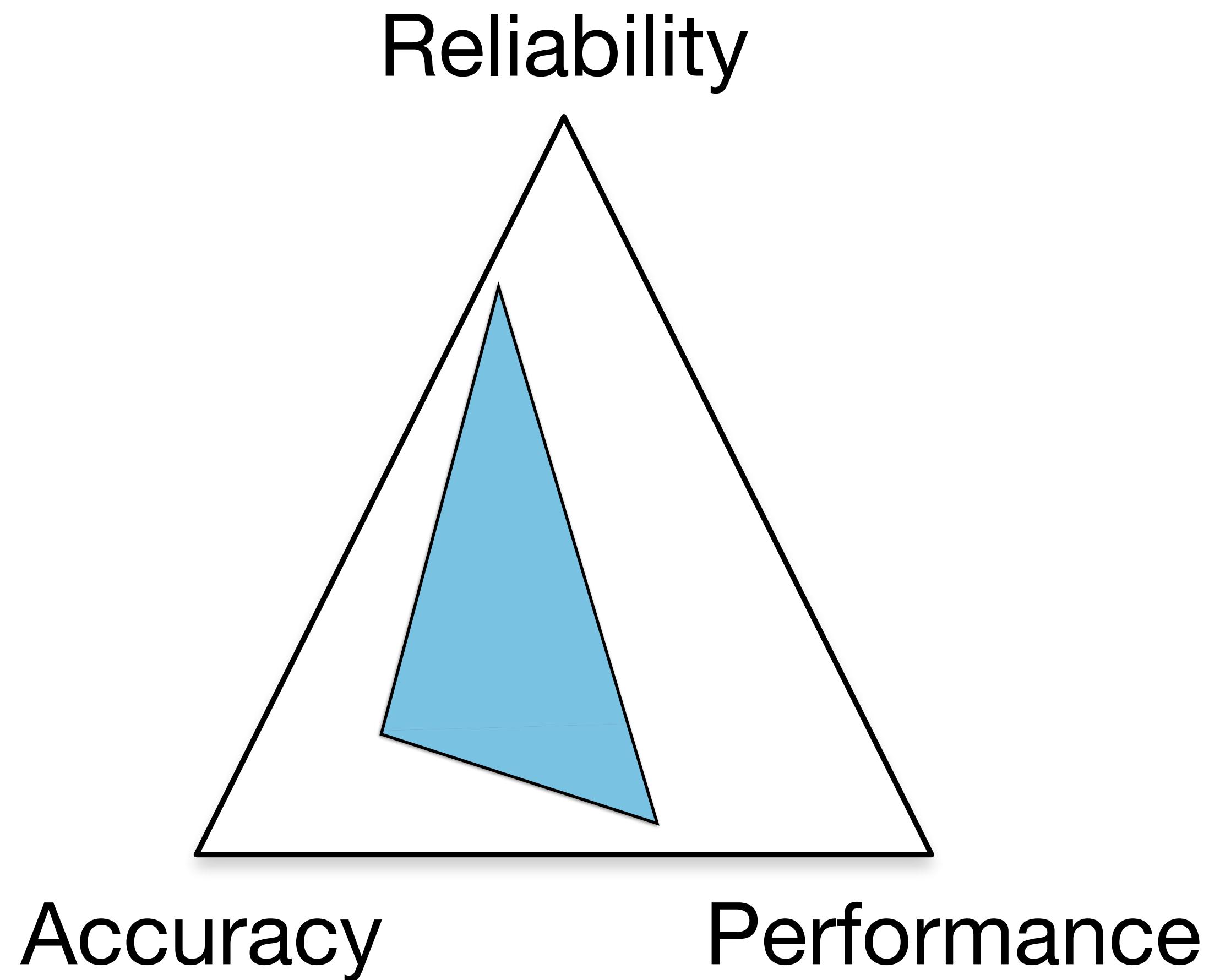
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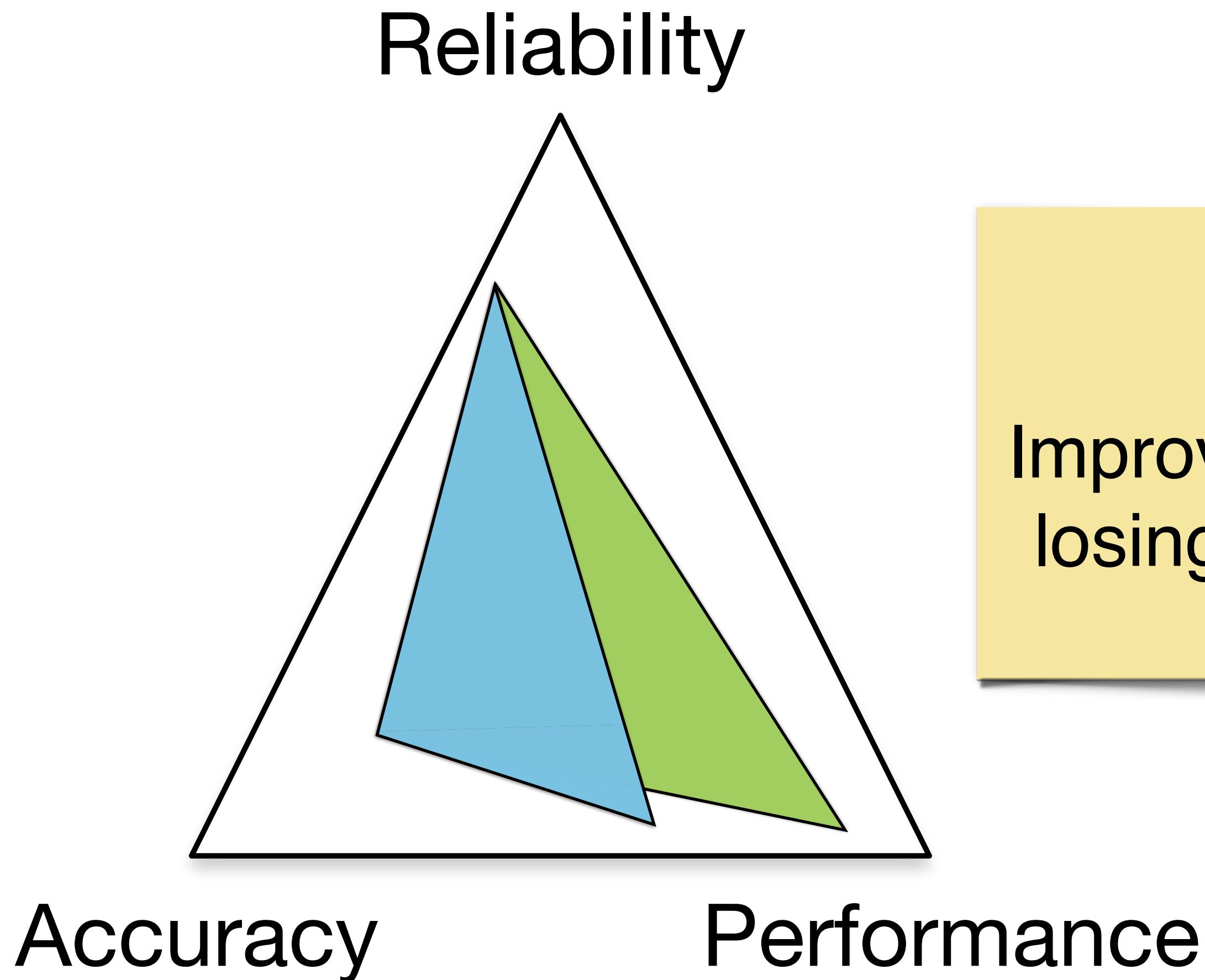
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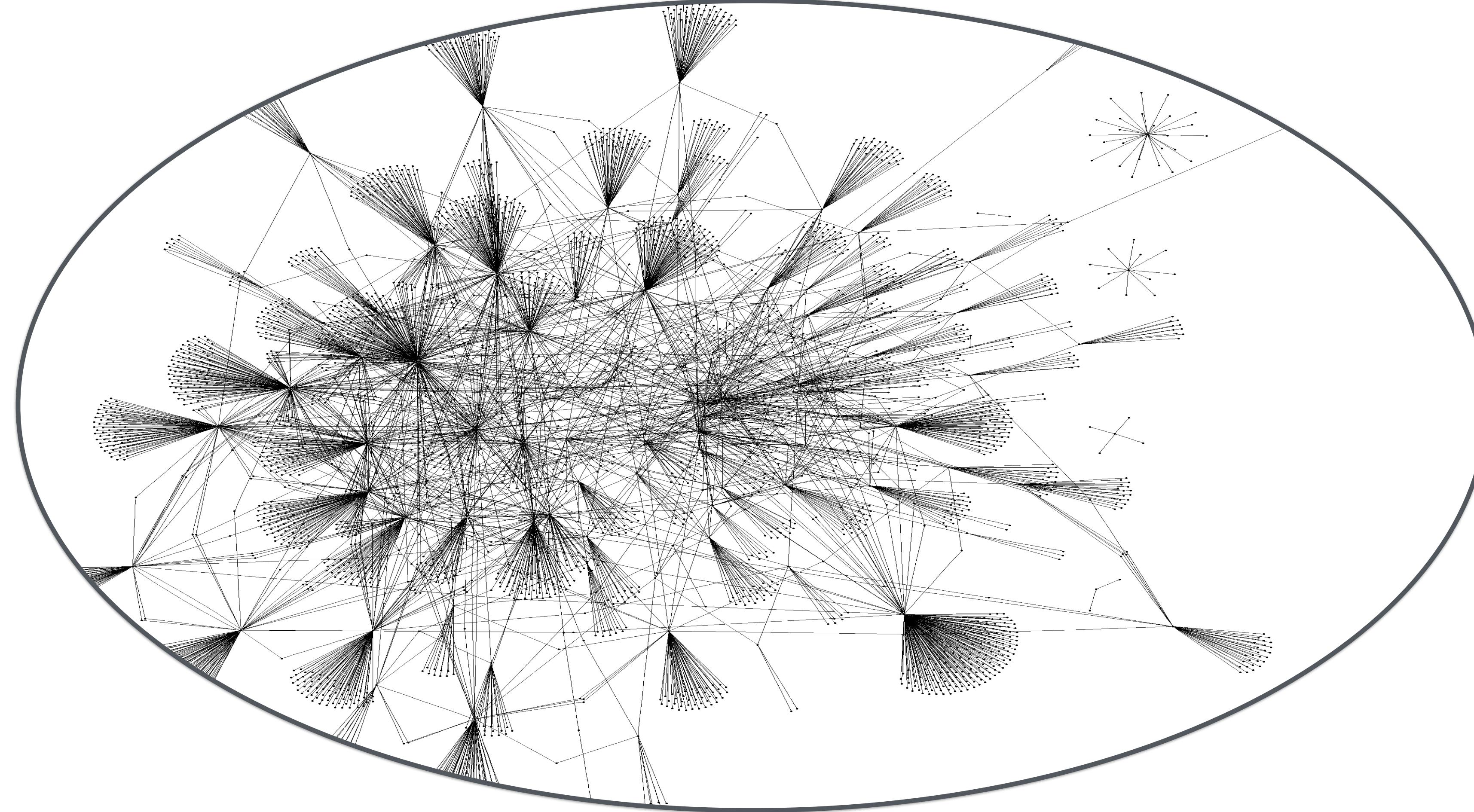
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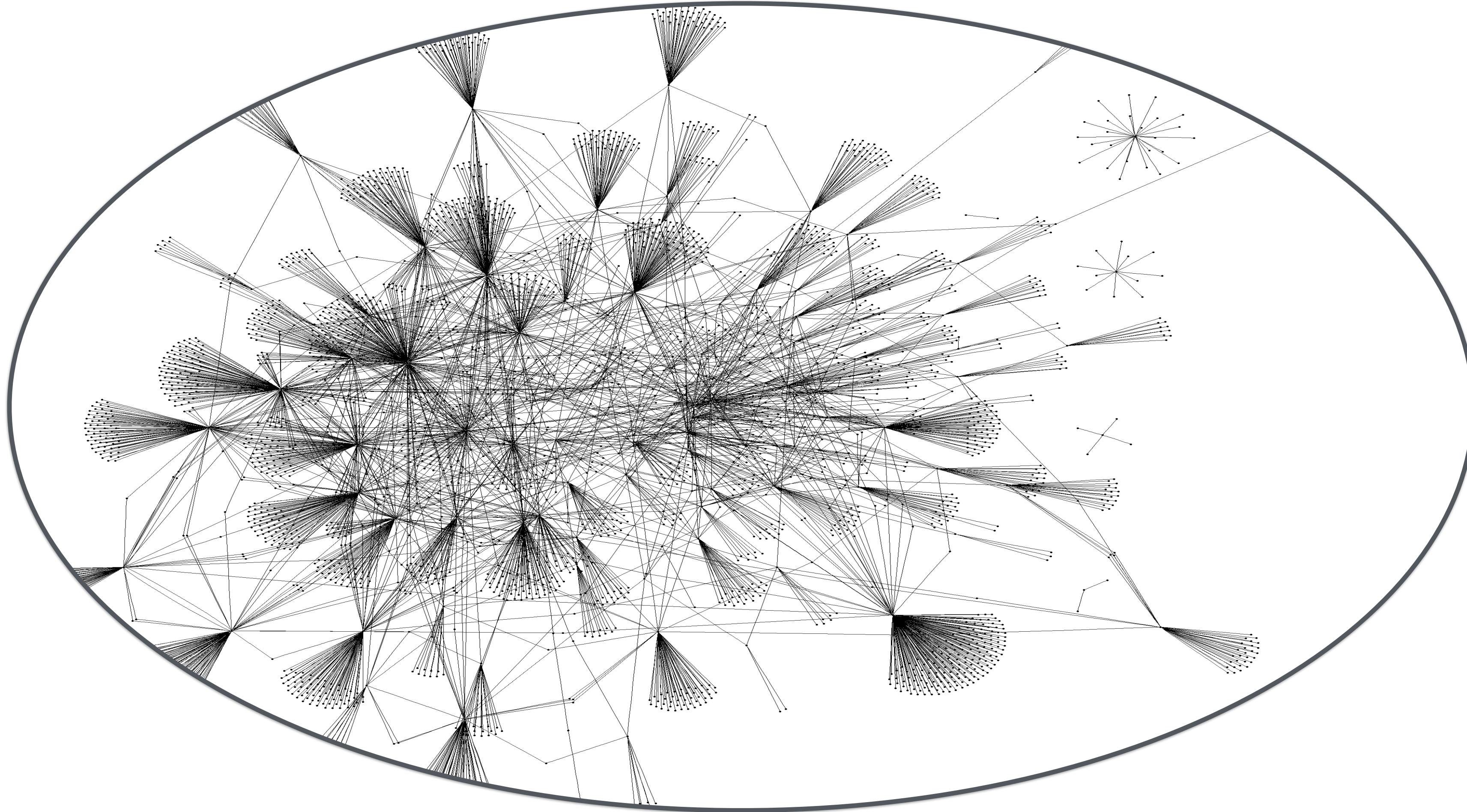
## Goal

Improve performance without  
losing accuracy or reliability

# Code (OpenSSL = 485k SLoC Firefox = 35.8m SLoC )



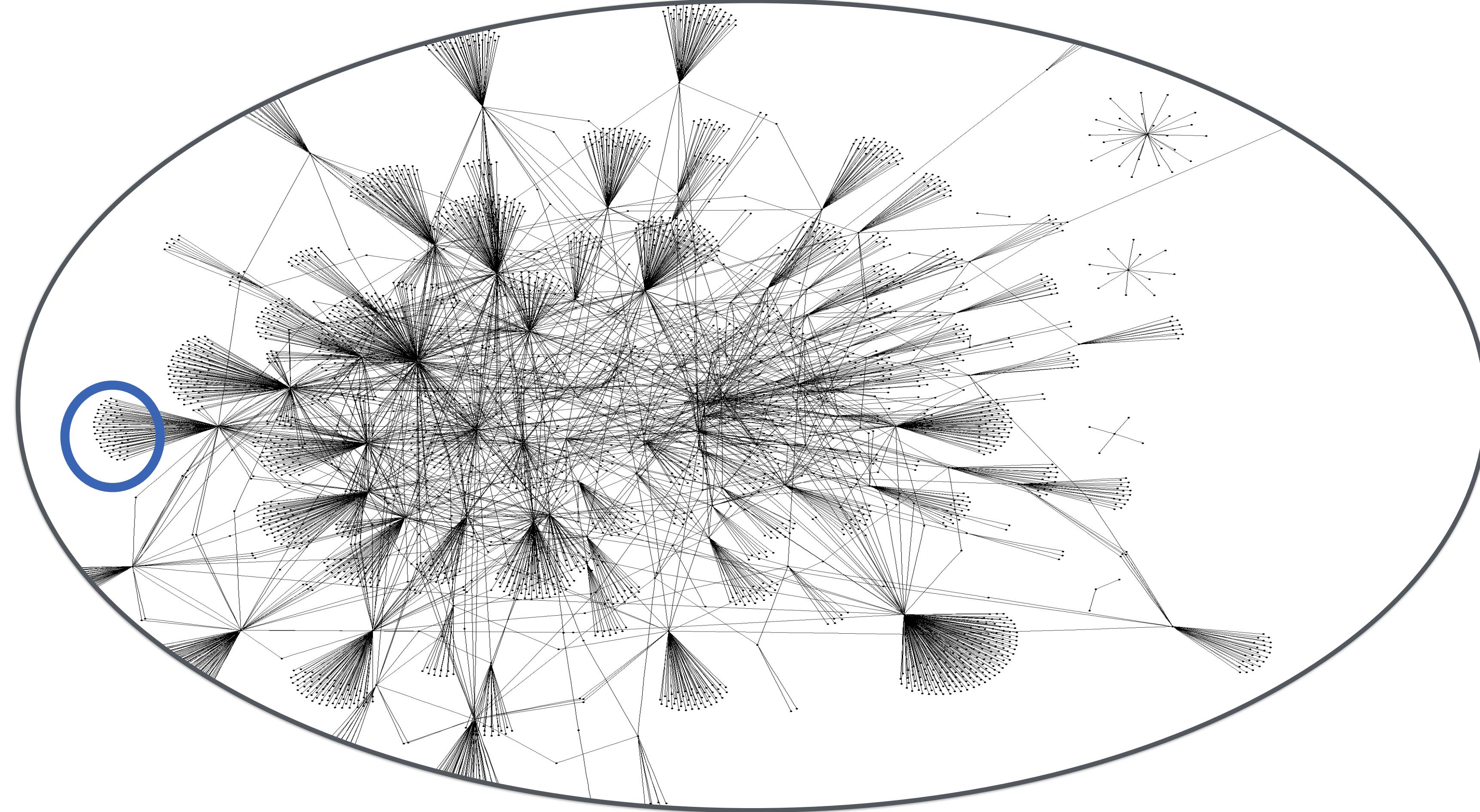
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**Incremental analysis:** only re-analyze code affected by change

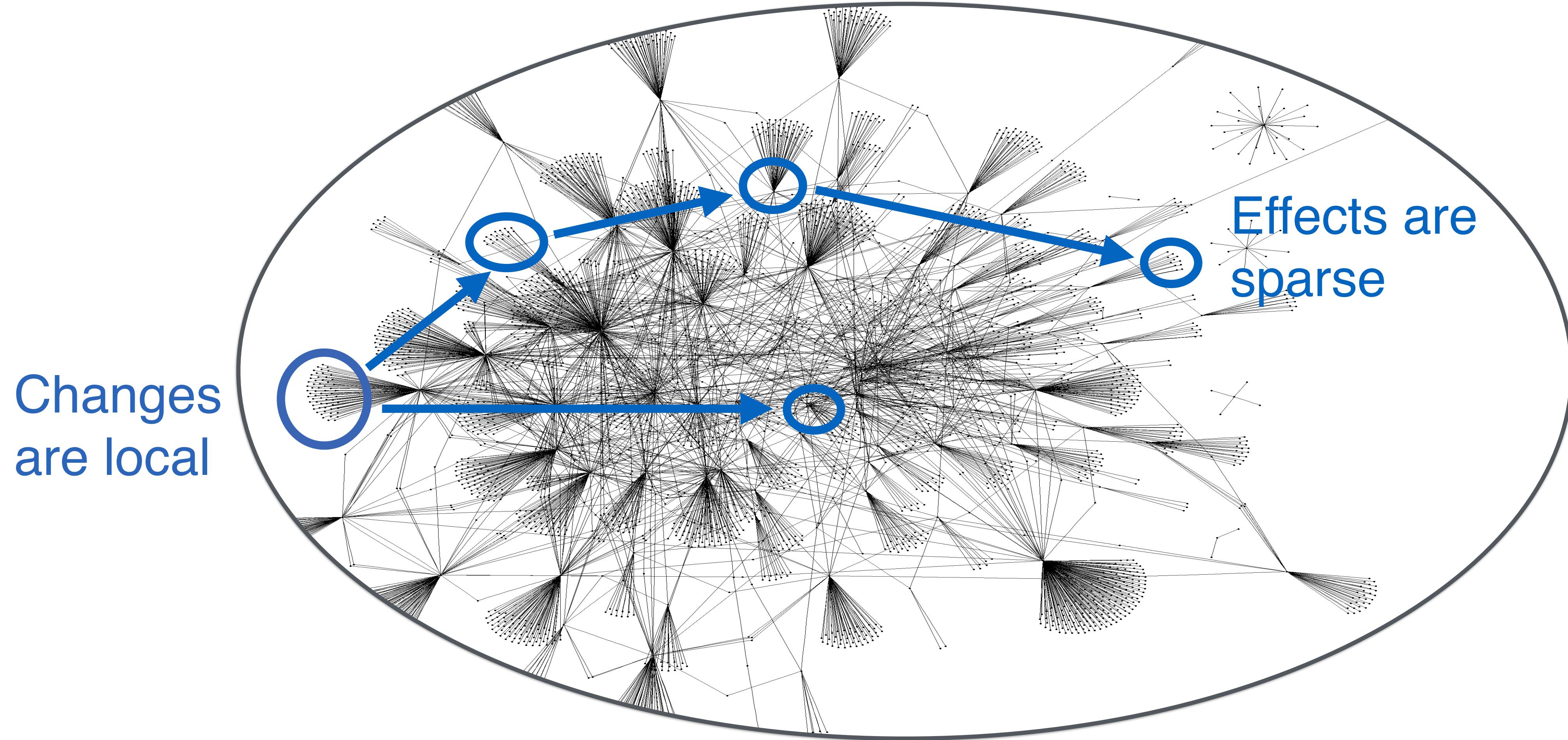
# Code (OpenSSL = 485k SLoC Firefox = 35.8m SLoC )

Changes  
are local



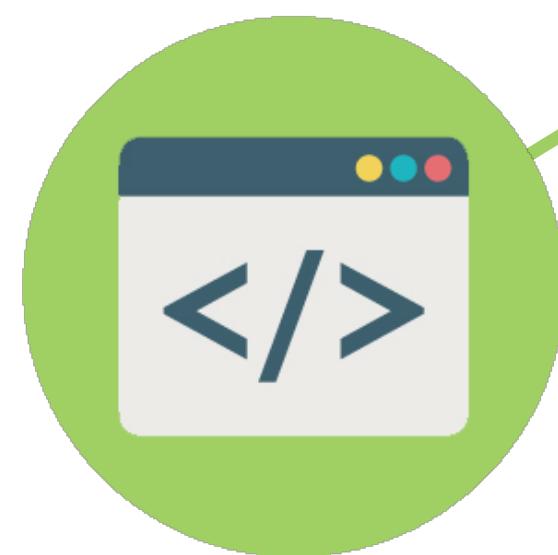
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# Code (OpenSSL = 485k SLoC Firefox = 35.8m SLoC )



**Incremental analysis:** only re-analyze code affected by change

**Source code**



Initial version

Initial analysis run

**Code feedback**



Initial result

## Source code

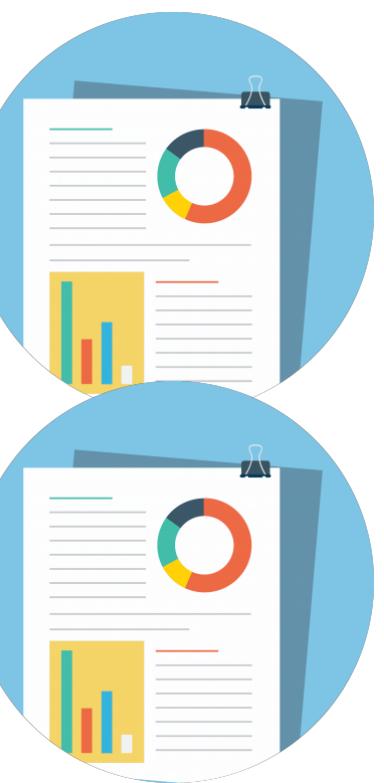


Initial version  
Change #1

Initial analysis run

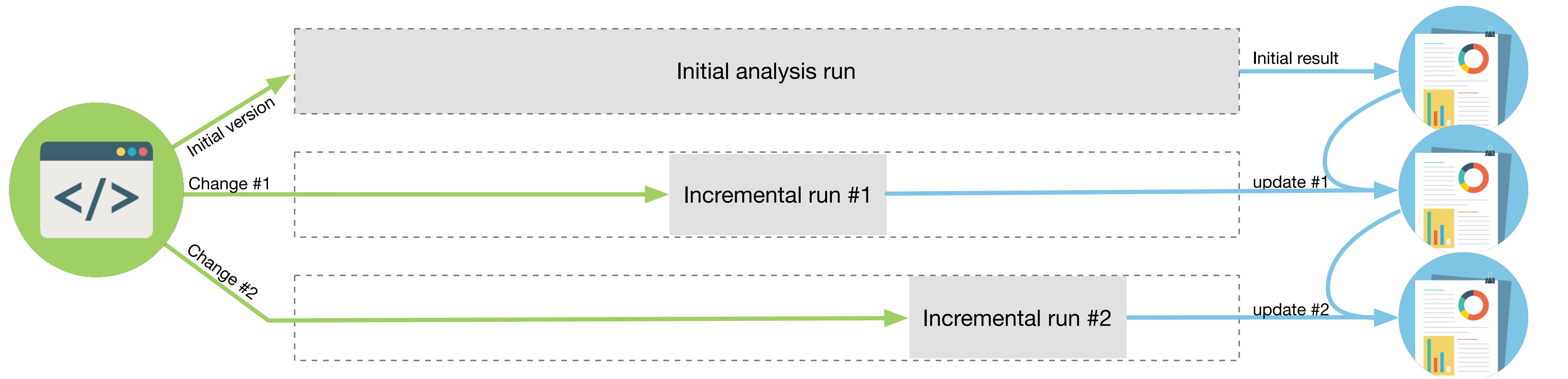
Incremental run #1

## Code feedback

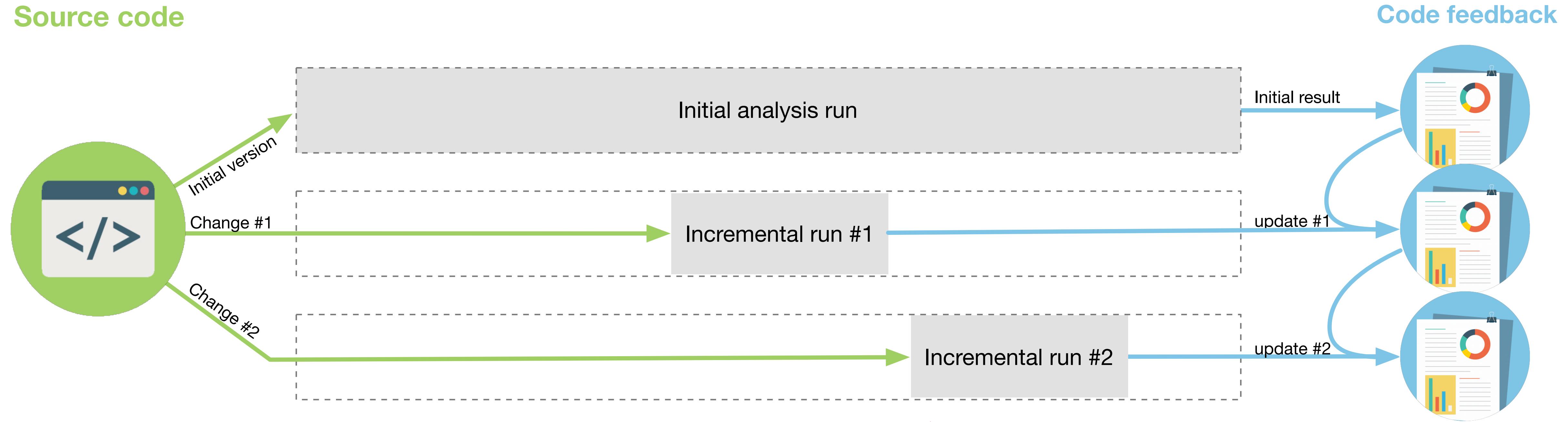


Initial result  
update #1

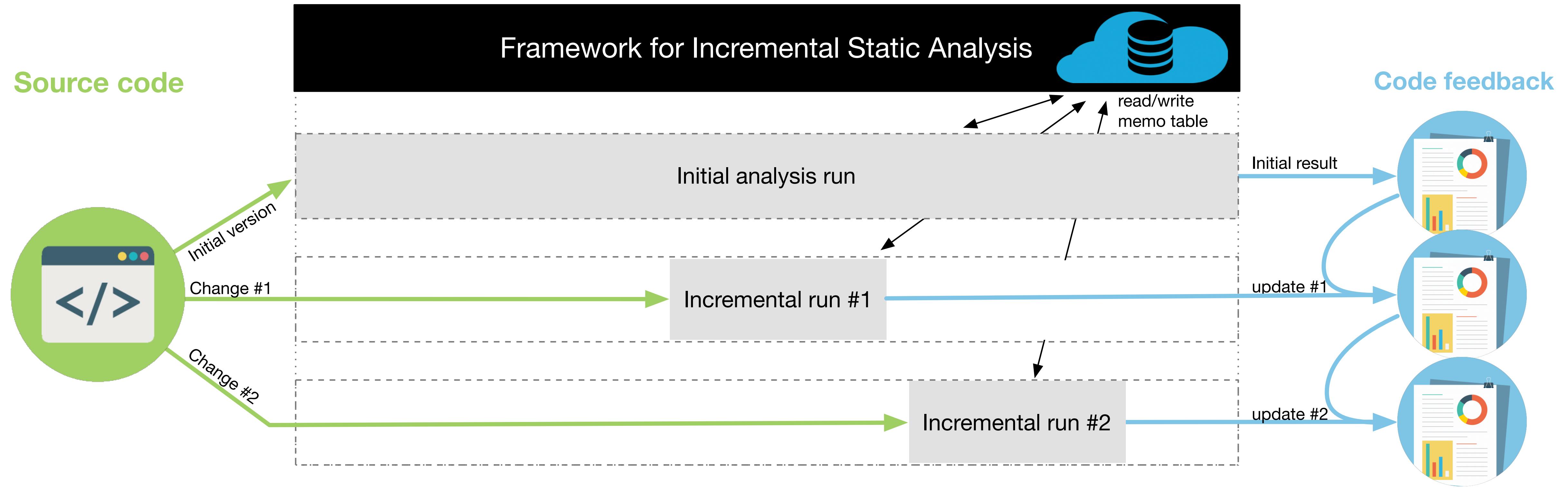
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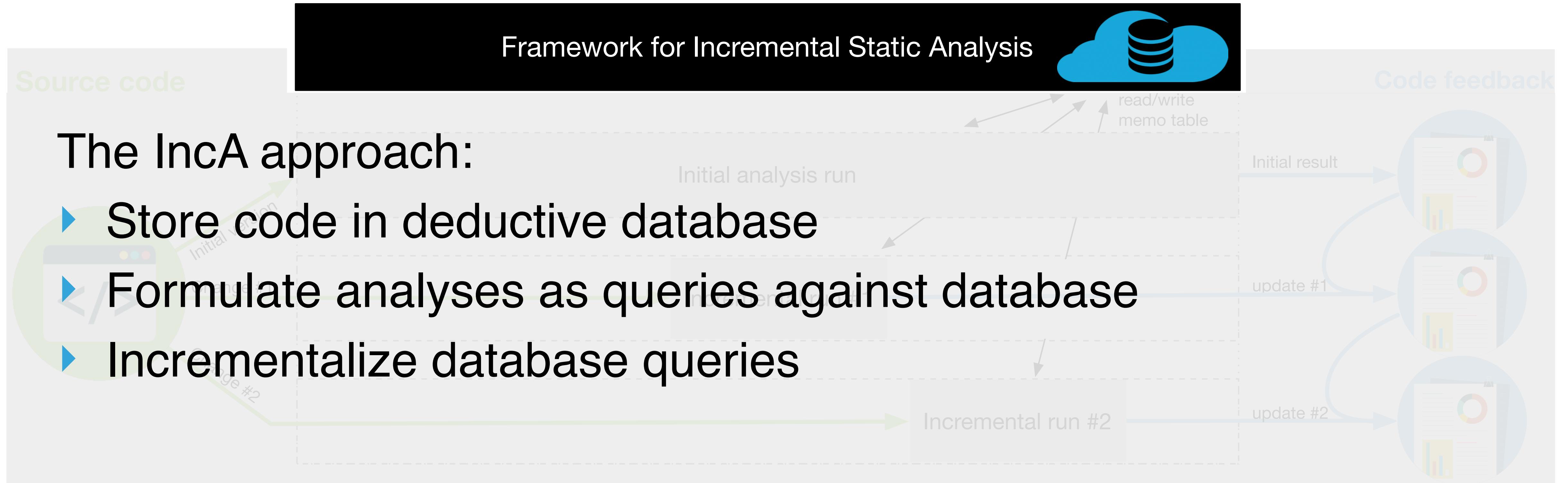
## Code feedback



**Asymptotical** performance improvements in theory  
10x-10000x speedup observable in practice



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# Code = Base relations

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(1) x = 7, y = 0;  
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```
Stmt = {1,2,3,4,5}  
Assign = {1,3,4,5}  
While = {2}  
Next = { (1,2), (3,4), (4,5) }  
Parent = { (3,2), (4,2), (5,2) }
```

expressions, functions, ...

# Analysis = Query

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# Incrementalization = Change propagation

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- + **IfStmt(2)**

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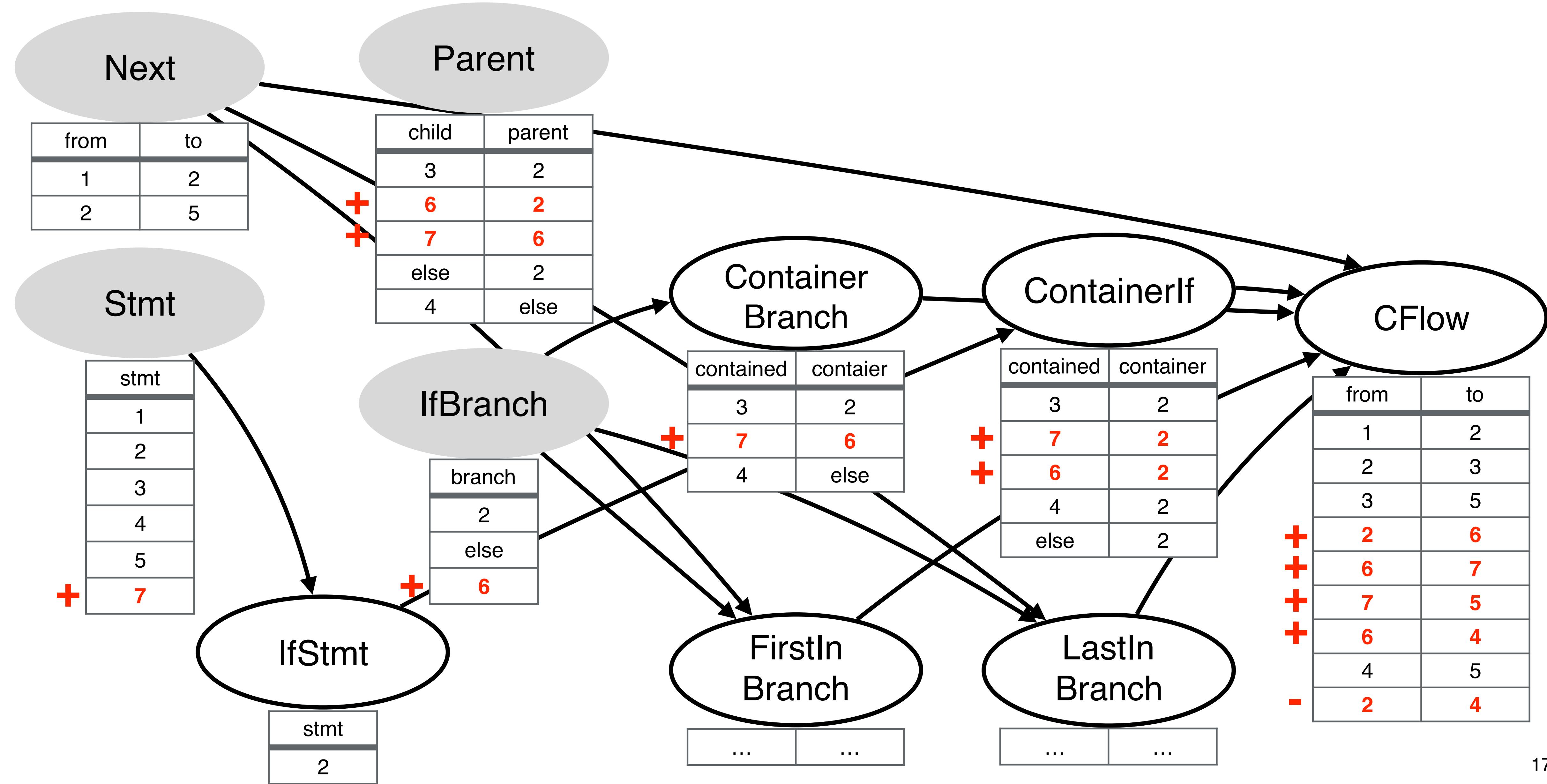
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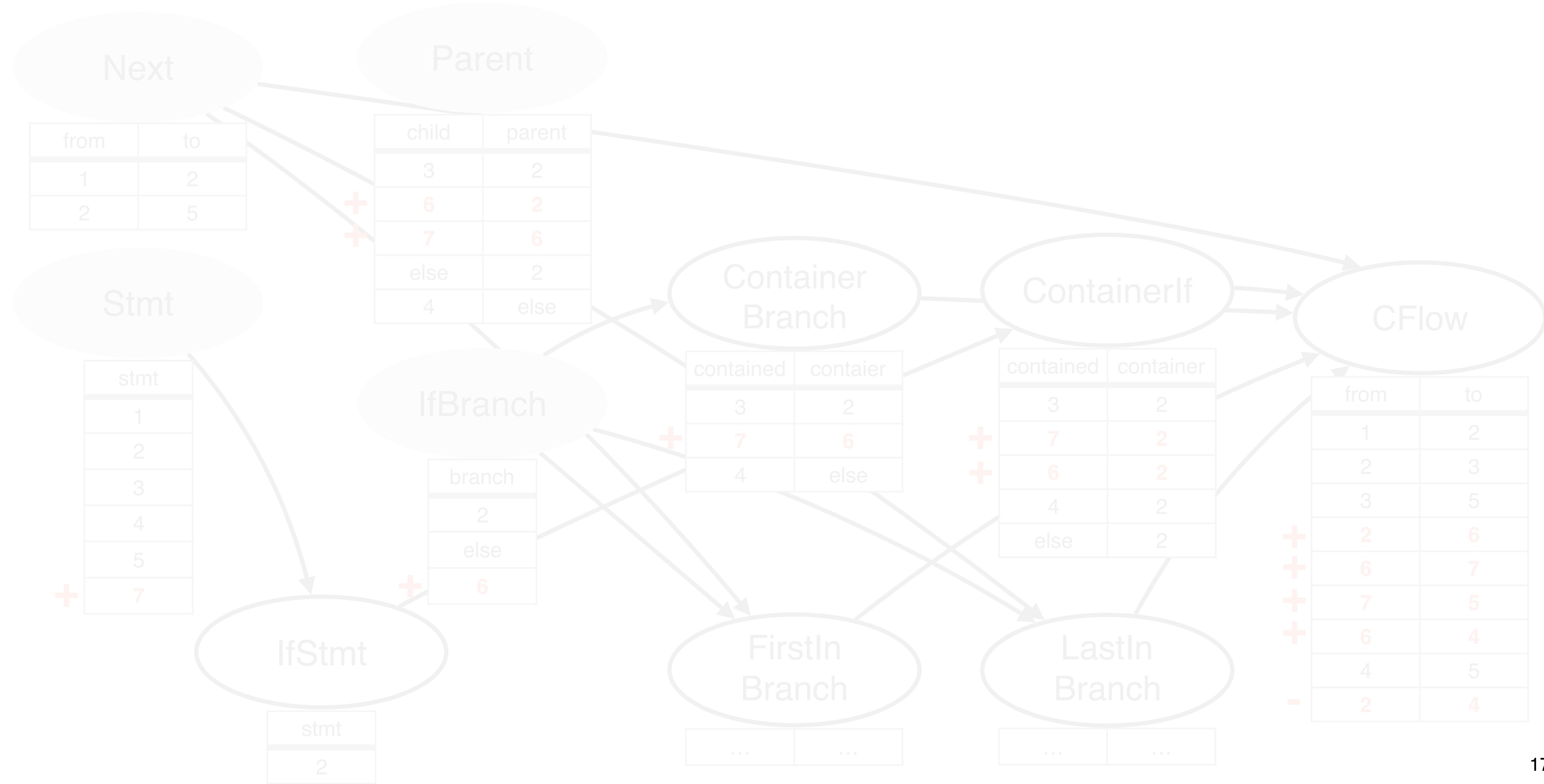
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```

# Technically: Computation Network



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# Abstraction: Provide regular language instead of DB queries

```
protected def resolveClassLocally(type : Type, module : Module) : ClassDec = {  
    foreach clazz in module.classes {  
        if (clazz.type:CName.name == type:CName.name) { return clazz }  
    }  
}
```

```
match expression with {  
    case Var(name: "this") =>  
        method := getContainingMethodDec(expression)  
        clazz := method.parent  
        assert clazz instanceof ClassDec  
        return clazz.type  
    case Var(name: x) =>  
        method := getContainingStaticMethodDec(expression)  
        parameter := method.params  
        assert parameter.name == x  
        return parameter.type
```

```
if (def resolveClassLocally(type, module)) {  
    return resolveClassLocally(type, module)  
} else {  
    foreach _import in module.imports {  
        return resolveClass(type, _import.module)  
    }  
}
```

# **Goal: Feedback within 100ms**

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< 25ms feedback

[OOPSLA'14, ASE'16]

**FindBugs**



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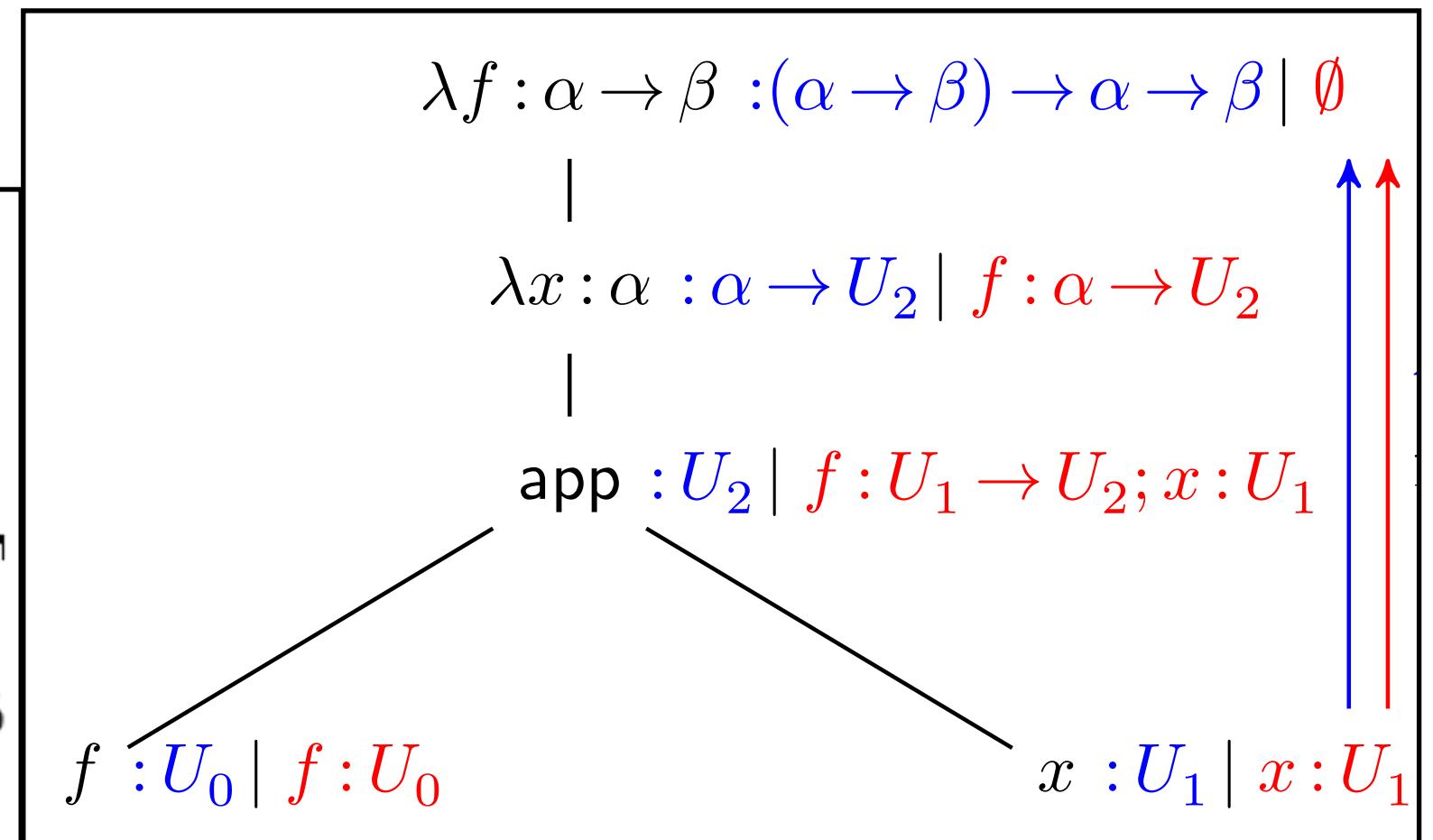
< 10ms feedback [OOPSLA'15, ECOOP'17]

< 25ms feedback Type checking: Java, Rust

[OOPSLA'14, ASE'16]

FindBugs

TM  
FindBugs  
because it's easy



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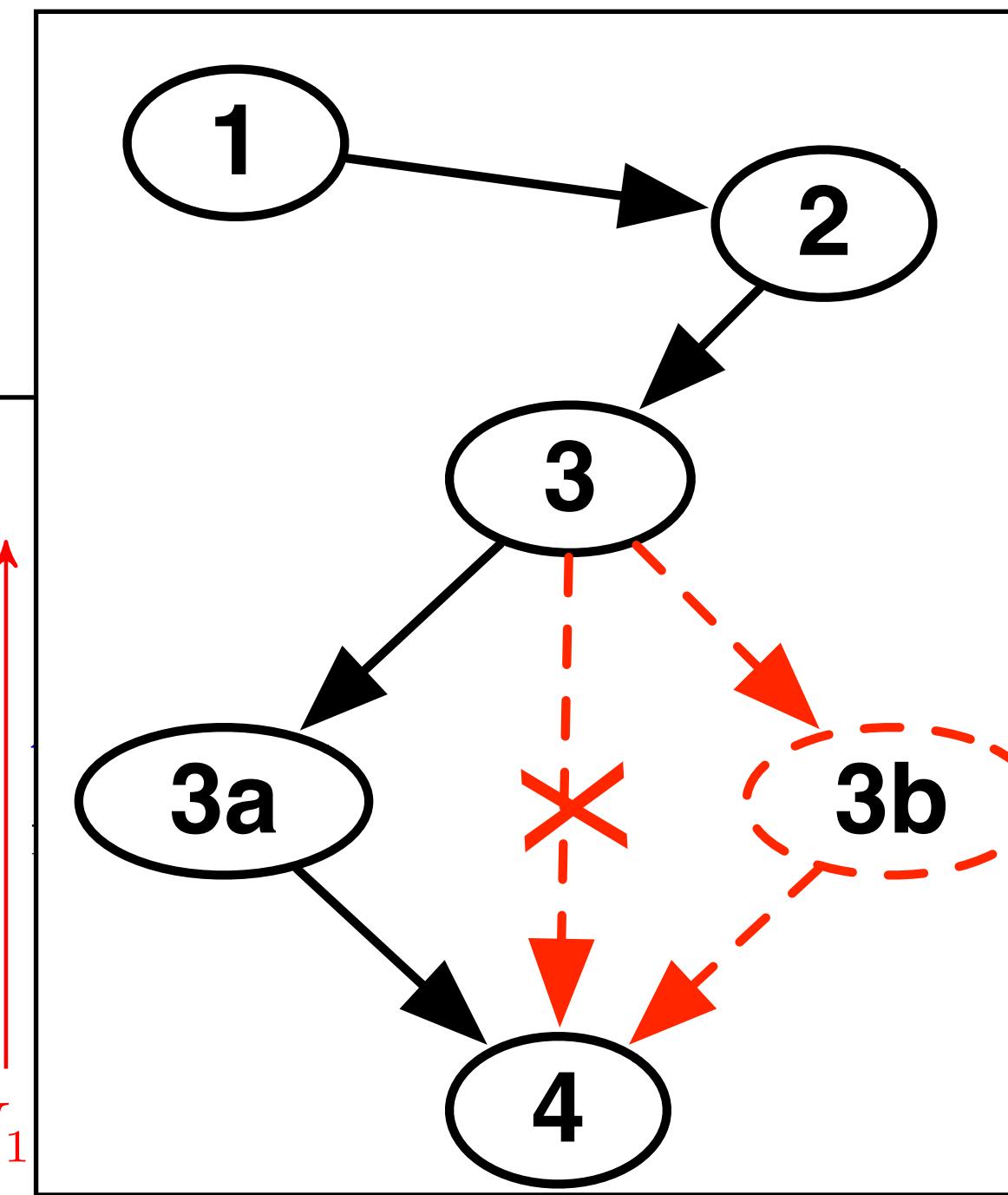
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< 10ms feedback [OOPSLA'15, ECOOP'17]  
Type checking: Java, Rust

$$\begin{aligned} &\lambda f : \alpha \rightarrow \beta : (\alpha \rightarrow \beta) \rightarrow \alpha \rightarrow \beta \mid \emptyset \\ &\quad | \\ &\quad \lambda x : \alpha : \alpha \rightarrow U_2 \mid f : \alpha \rightarrow U_2 \\ &\quad | \\ &\quad \text{app} : U_2 \mid f : U_1 \rightarrow U_2; x : U_1 \end{aligned}$$

$f : U_0 \mid f : U_0$        $x : U_1 \mid x : U_1$

< 30ms feedback [ASE'16]  
Control flow: C, Java



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$$\lambda f : \alpha \rightarrow \beta : (\alpha \rightarrow \beta) \rightarrow \alpha \rightarrow \beta | \emptyset$$

$$|$$

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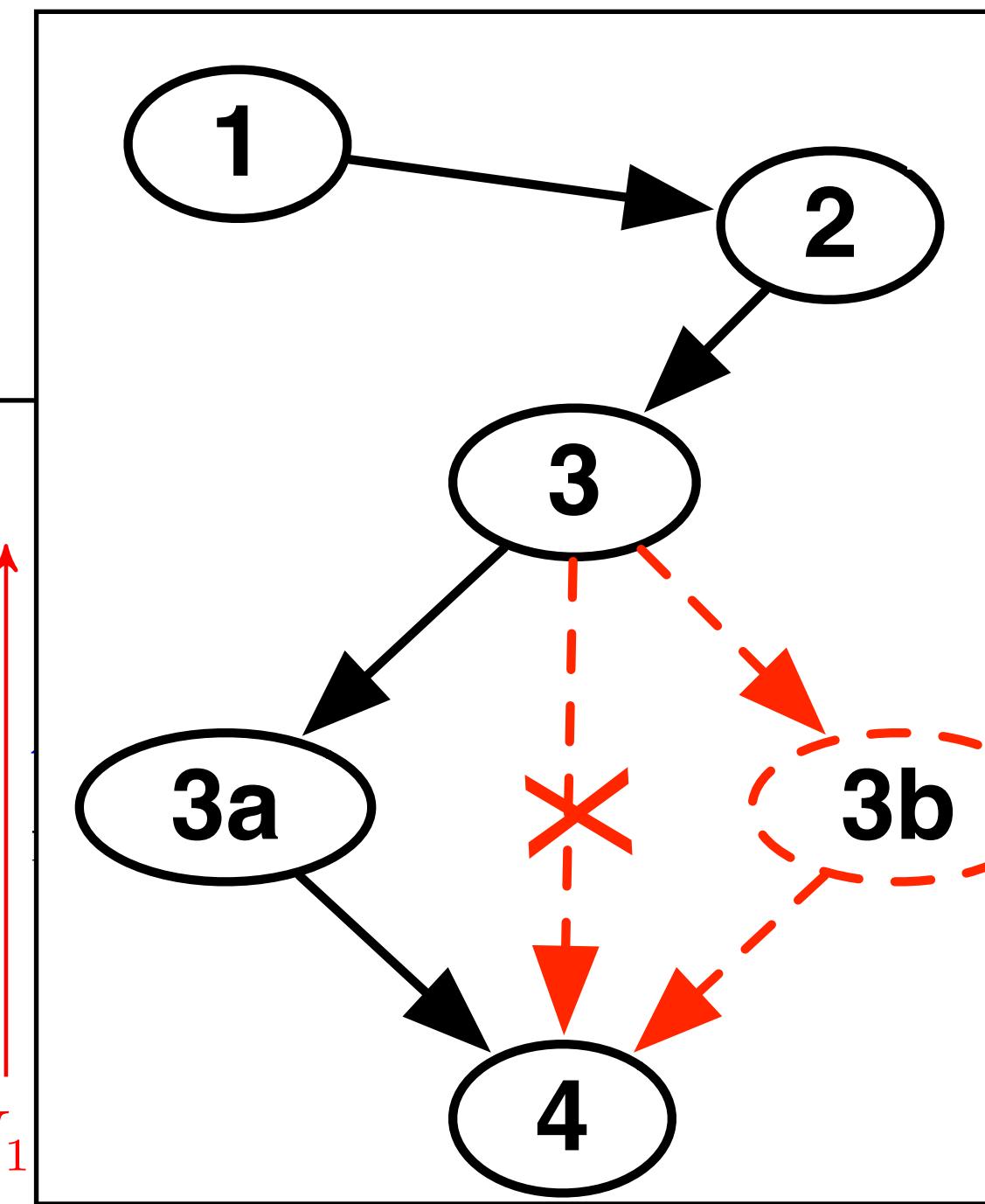
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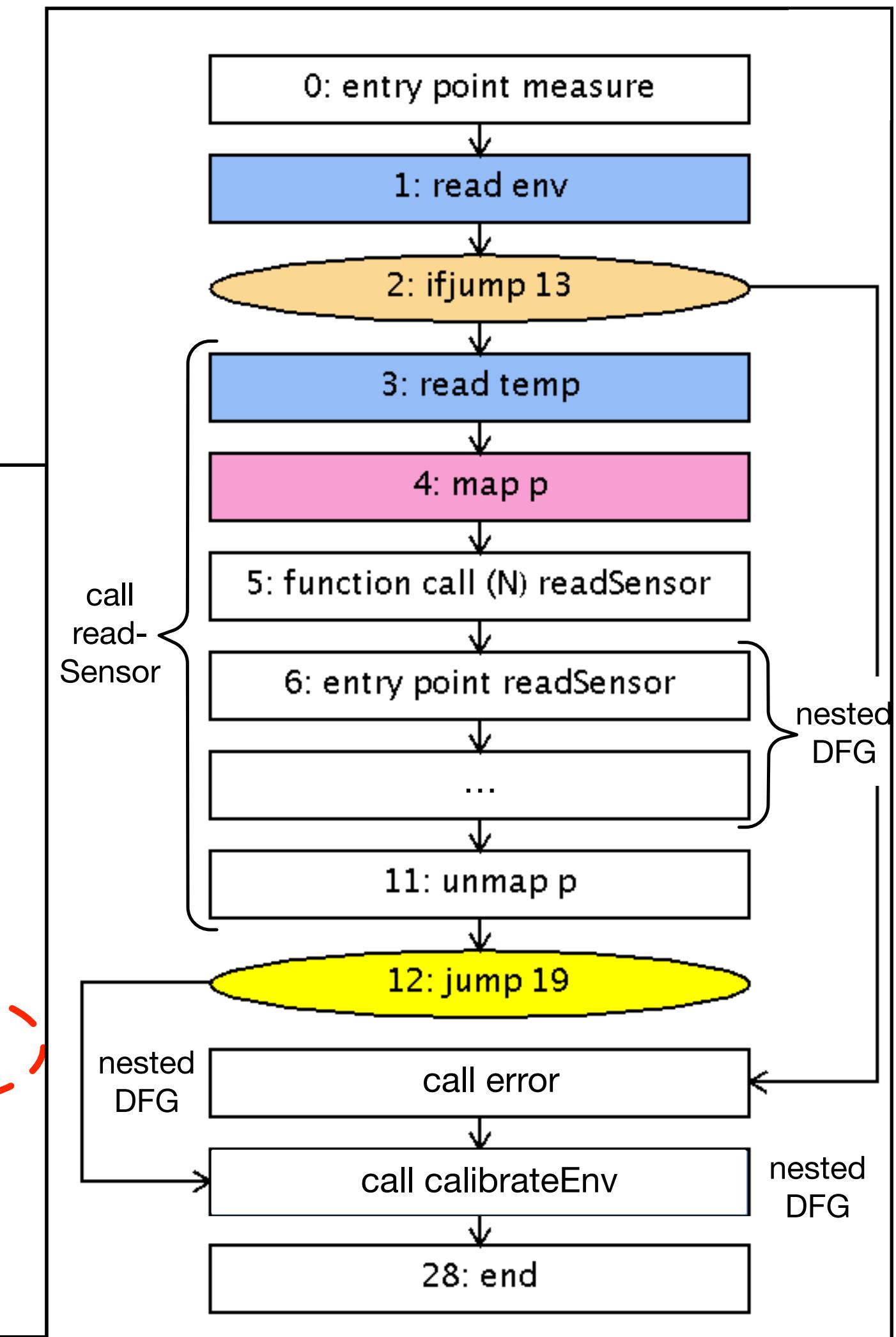
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[ASE'16]

Control flow: C, Java



< 20ms feedback  
[OOPSLA'18]

Data flow: Java



# Challenges: scalability, memory, expressiveness

## Goal: Feedback within 100ms

< 25ms feedback  
[OOPSLA'14, ASE'16]

FindBugs



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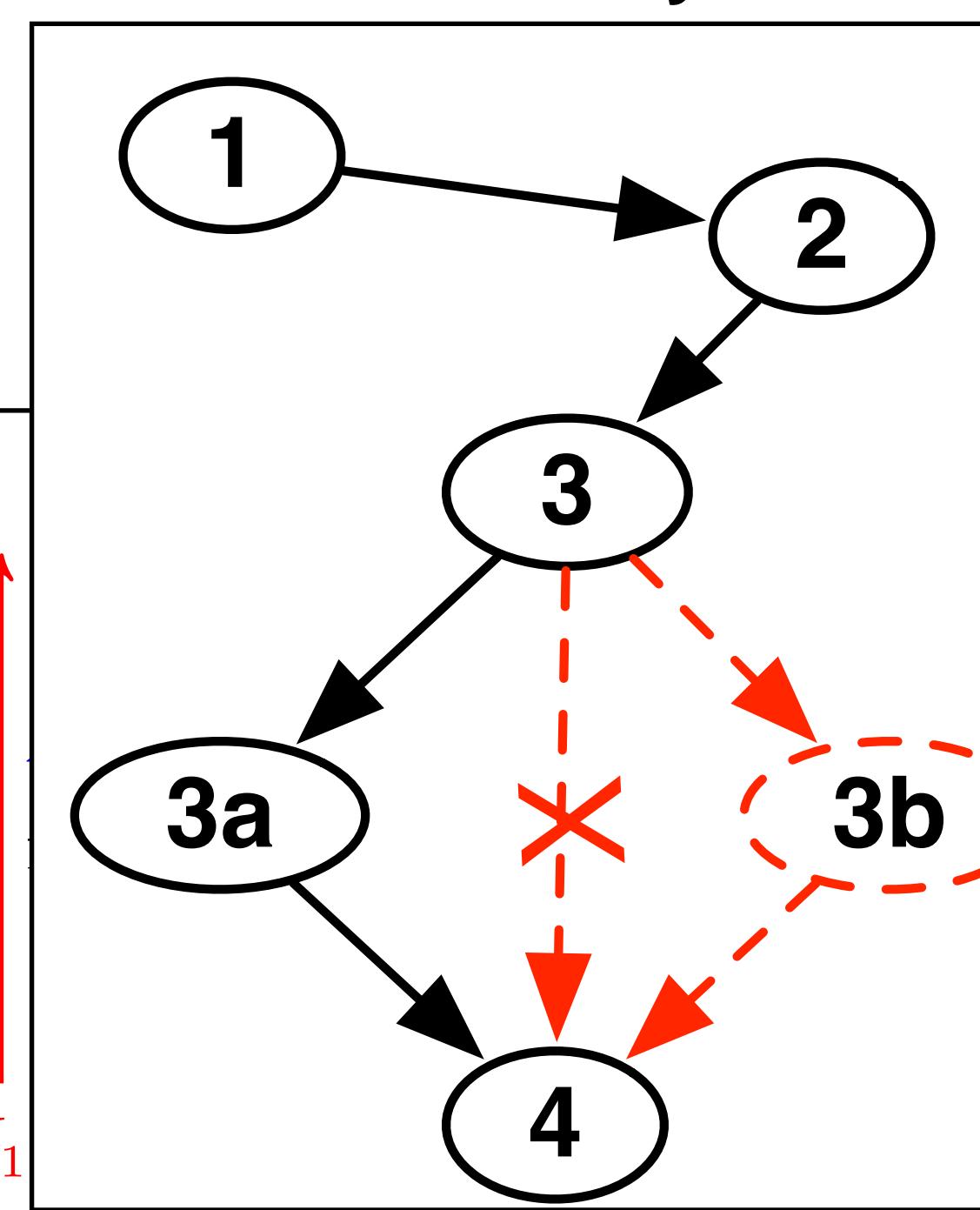
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$$app : U_2 | f : U_1 \rightarrow U_2; x : U_1$$

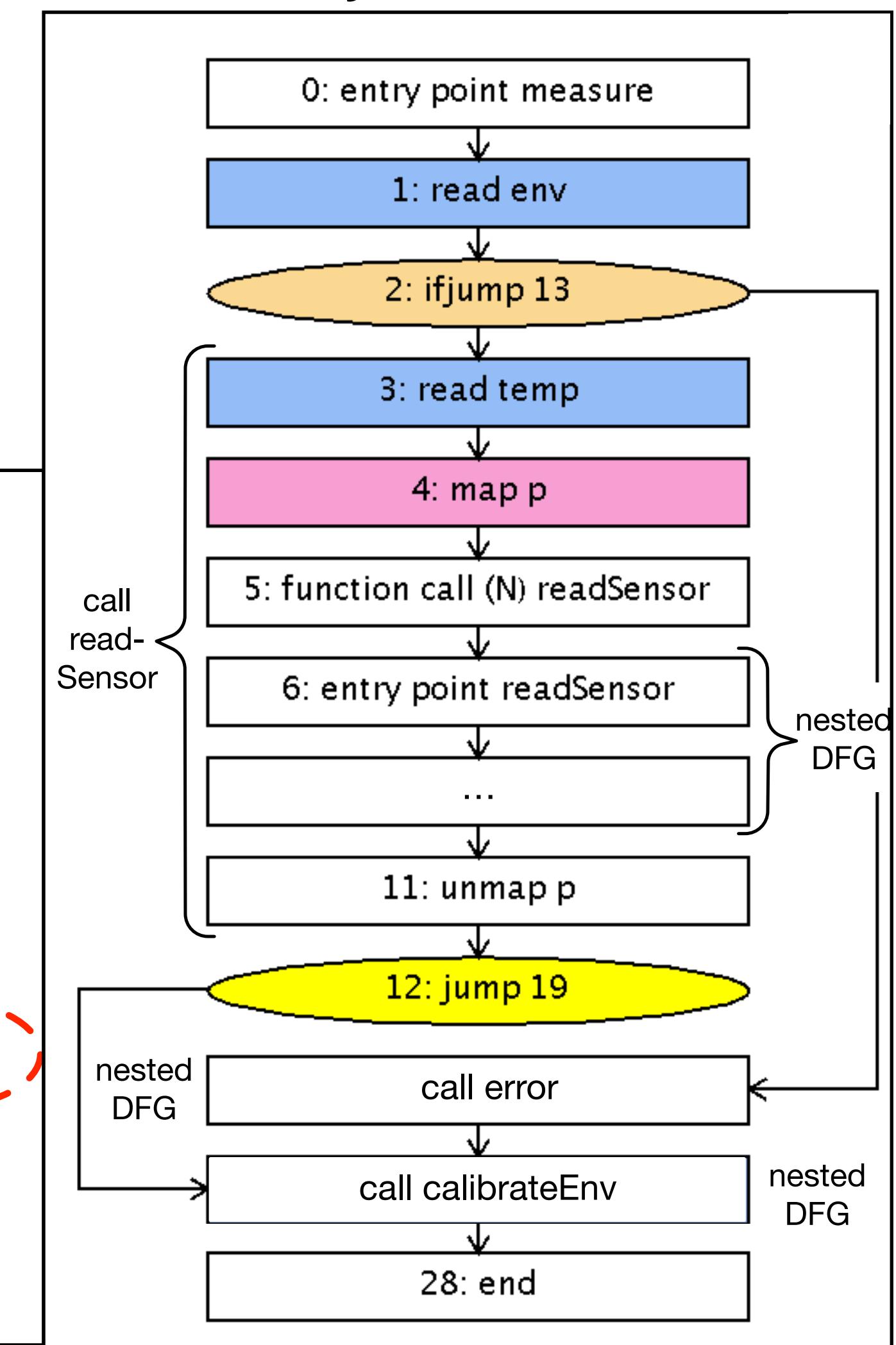
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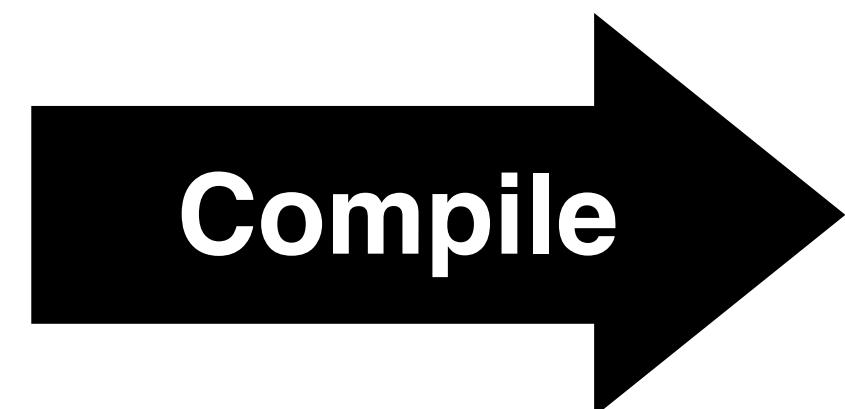
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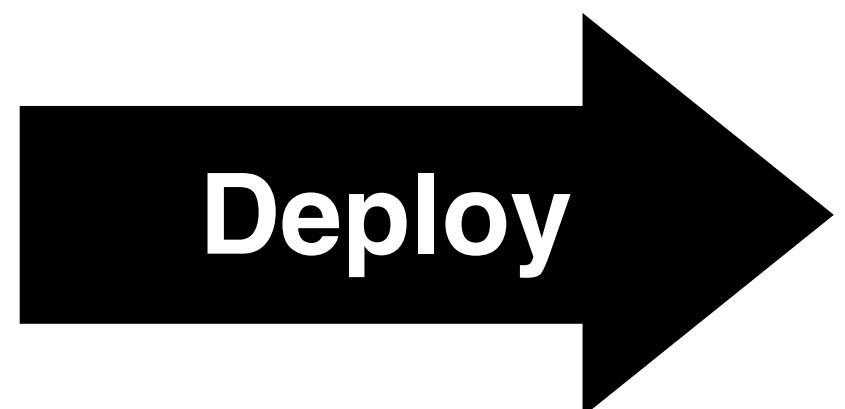
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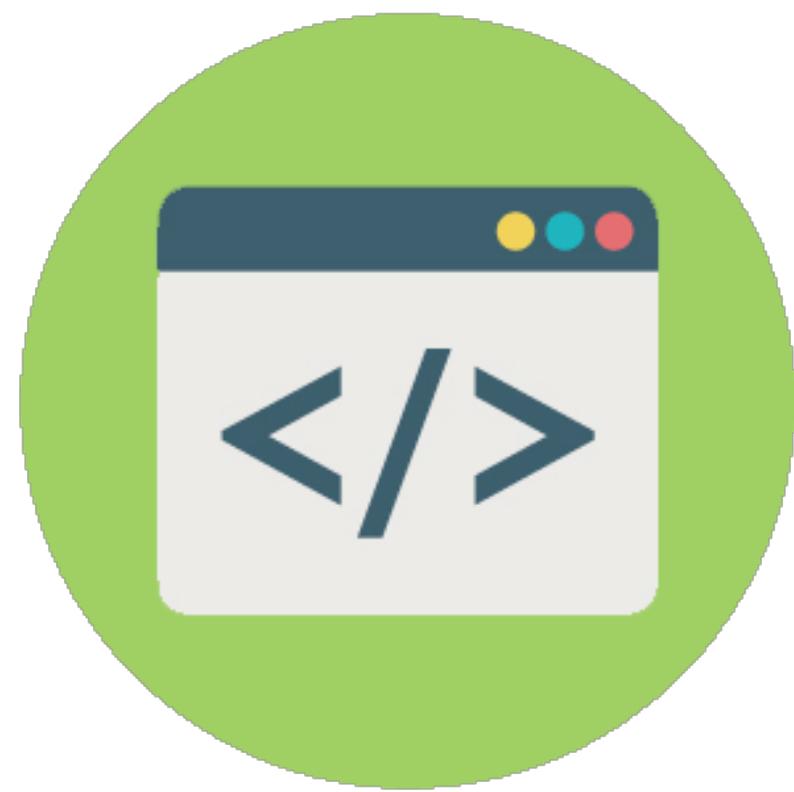
**Deploy**



**Customer /  
Production**



**Source code**



**Binary**



**Compile**

**Deploy**

**Customer /  
Production**



## **What to do with the time saved?**

- Provide feedback faster – Improve adoption by developers
- Do more in same time – Improve accuracy and reliability