

*ASE 2018*

# Datalog-based Scalable Semantic Diffing of Concurrent Programs

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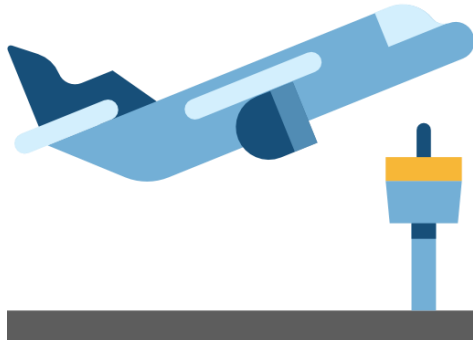


| Constantin Enea



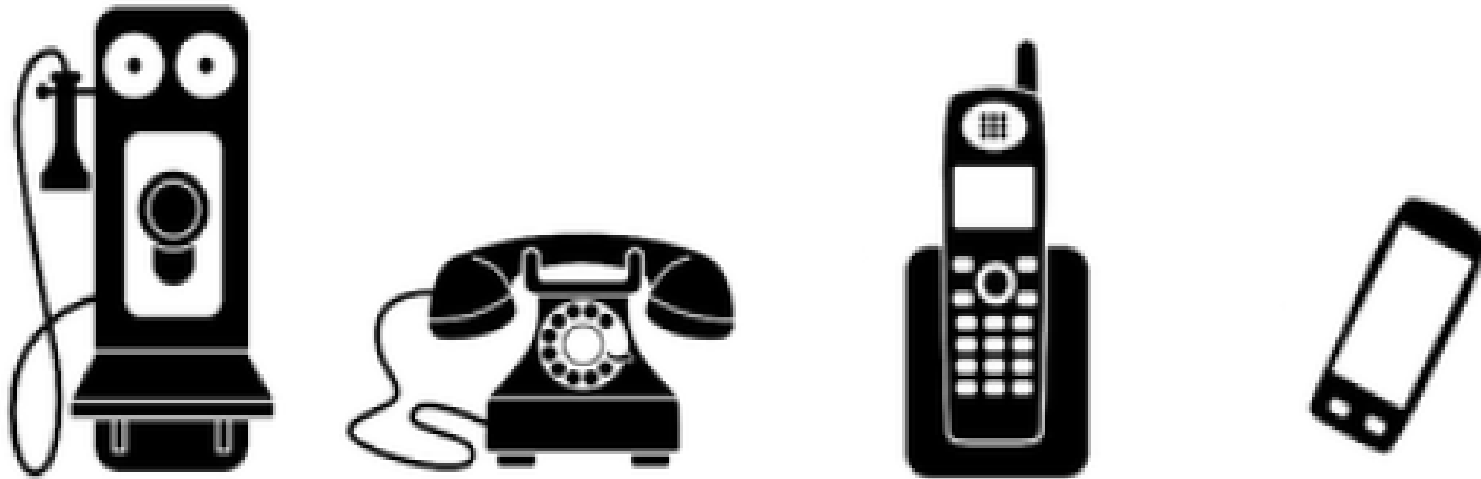


# Concurrent Programs



# Evolving Software

*becoming better*

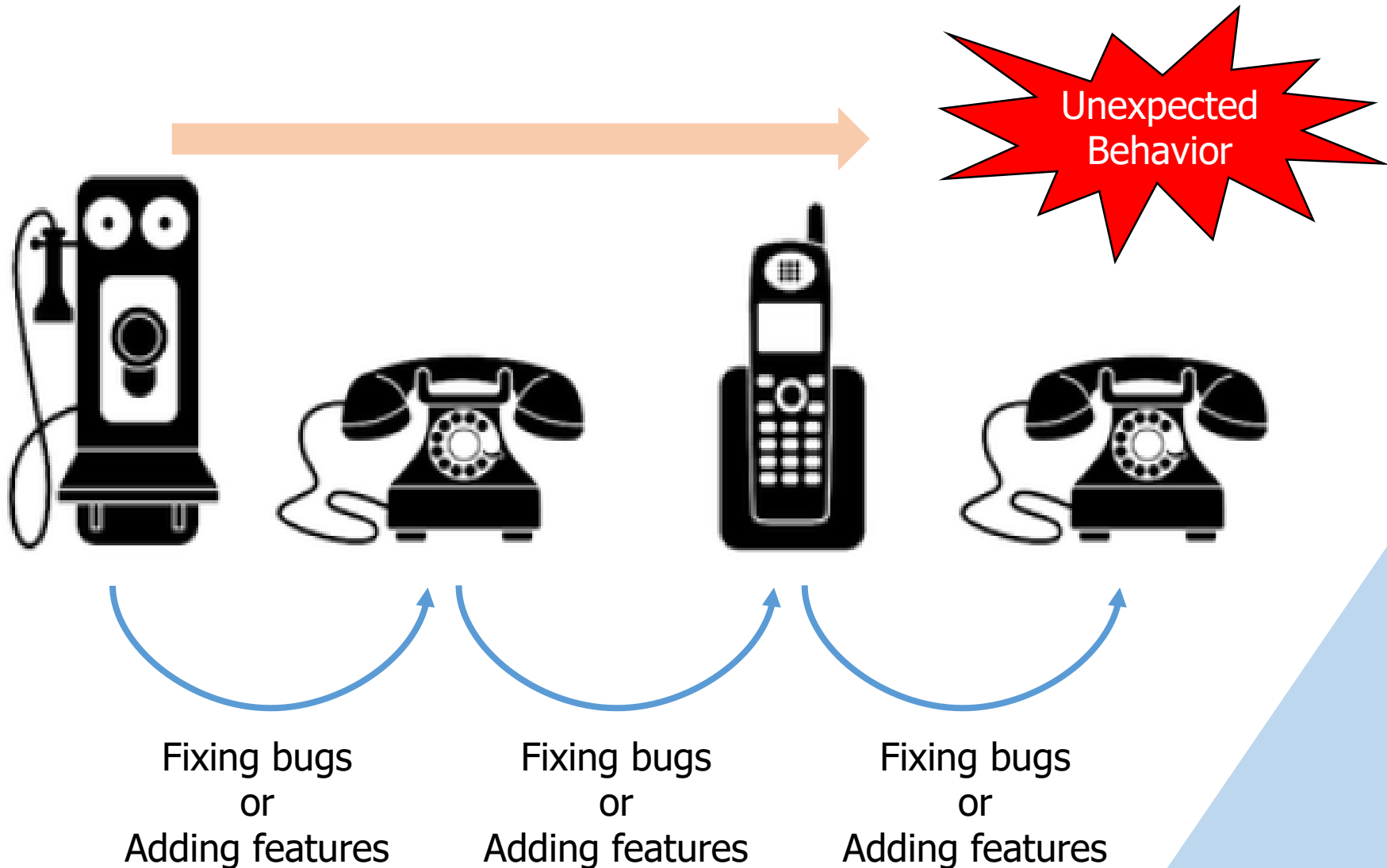


Fixing bugs  
or  
Adding features

Fixing bugs  
or  
Adding features

Fixing bugs  
or  
Adding features

# Evolving Software



Thread 1

```
lock(a);  
x = 1;  
y = x;  
unlock(a);
```

Thread 2

```
lock(a);  
x = 0;  
unlock(a);
```



Thread 1

```
lock(a);  
x = 1;  
y = x;  
unlock(a);
```

Thread 2

```
lock(a);  
x = 0;  
unlock(a);
```

*New Read-from edge is created!!*

# Comparison after a change

Program

```
while bytcount<0x20000:  
    client.CChaltcpu();  
  
    randcode=client.CCpeekiramword(0x08);  
    randcount=client.CCpeekiramword(0x0A);  
  
    if randcount!=lastcount and randcode==0xbeef:  
        #New bytes are ready, halted in steady state.  
        lastcount=randcount;  
        for a in range(bytestart,bytestart+bytcount):  
            file.write(chr(client.CCpeekirambyte(a)));  
            bytcount=bytcount+1;  
        print "Got 0x%06x bytes:" % bytcount;  
        print "%04x %04x: %02x%02x..." % (  
            client.CCpeekiramword(0x08),  
            client.CCpeekiramword(0x0A),  
            client.CCpeekirambyte(0x0C),  
            client.CCpeekirambyte(0x0D));  
  
client.CCReleasecpu();
```

Program after a change

```
while bytcount<0x20000:  
    client.CChaltcpu();  
  
    randcode=client.CCpeekiramword(0x08);  
    randcount=client.CCpeekiramword(0x0A);  
  
    if randcount!=lastcount and randcode==0xbeef:  
        #New bytes are ready, halted in steady state.  
        lastcount=randcount;  
        for a in range(bytestart,bytestart+bytcount):  
            file.write(chr(client.CCpeekirambyte(a)));  
            bytcount=bytcount+1;  
        print "Got 0x%06x bytes:" % bytcount;  
        print "%04x %04x: %02x%02x..." % (  
            client.CCpeekiramword(0x08),  
            client.CCpeekiramword(0x0A),  
            client.CCpeekirambyte(0x0C),  
            client.CCpeekirambyte(0x0D));  
  
client.CCReleasecpu();
```

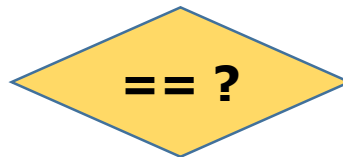
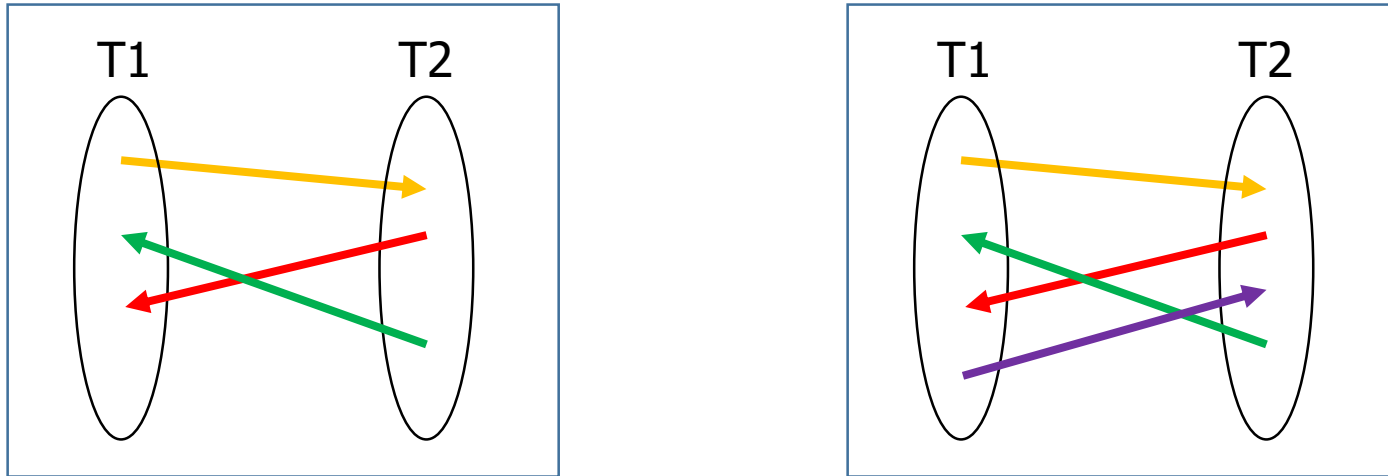


NO!



Is there any unexpected new behavior?

# Semantic difference



New data-flow edge



# Prior work

- Bounded Model Checking (BMC) based approach
  - Need to instrument code with assertions
  - Interleaving enumeration => expensive

[Bouajjani et al. *SAS 2017*]

# Our approach

- Constraint-based scalable program analysis
  - No code instrumentation needed
  - No interleaving enumeration
  - **10x to 1000x faster**
  - **Practically accurate**

# Outline

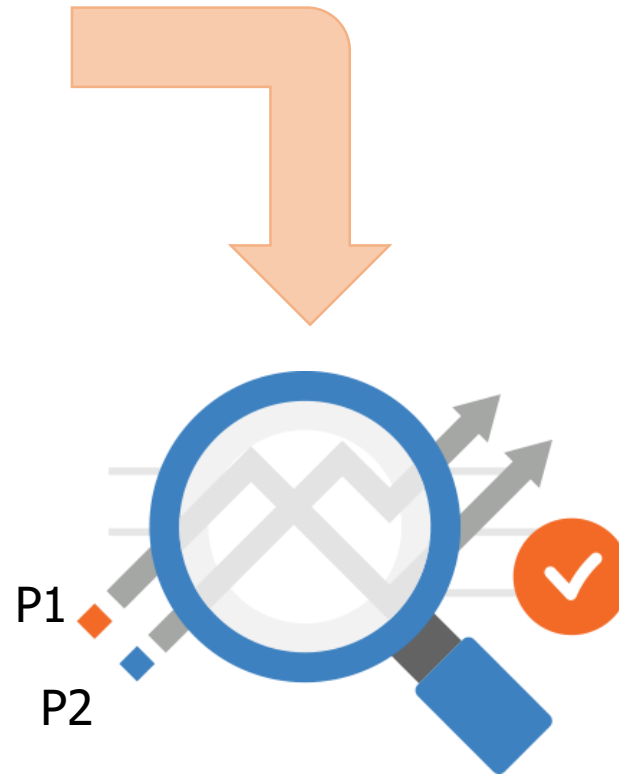
- Motivation
- ***Contribution***  
*(Scalable approximate semantic diffing)*
- Experiments
- Conclusion

# Overview

Datalog inference rules  
for semantic diffing

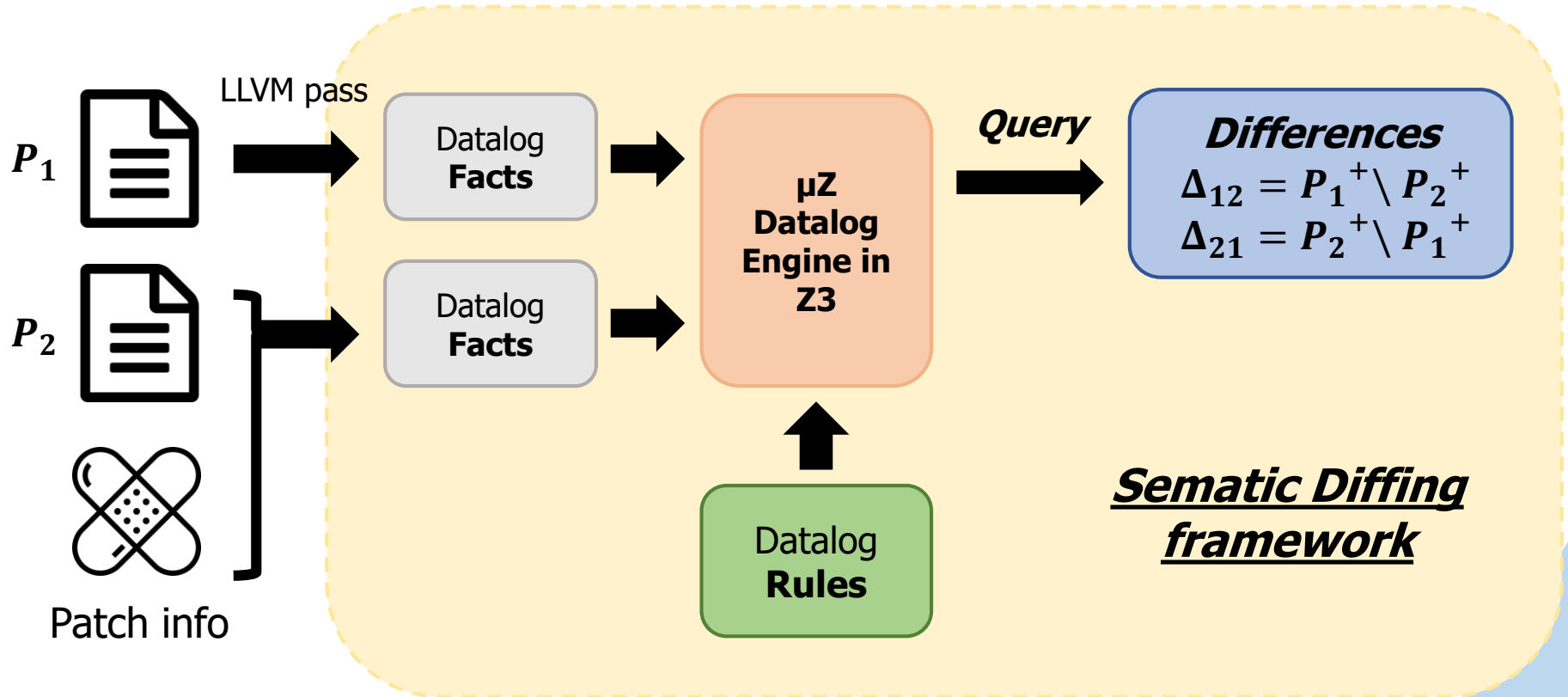


*Scalable & Practically Accurate!*



**Compare the allowed data-flow edges  
over two programs**

# Overview



# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    assert(x != t);  
    unlock(a);  
}
```

```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```

# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    assert(x != t);  
    unlock(a);  
}
```

```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```

# Example

t=0, x=1

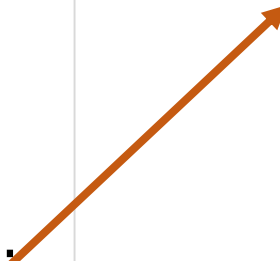
```
Thread1() {  
    t = 0;  
    ↓ x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    assert(x != t);  
    unlock(a);  
}
```

```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```



# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    assert(x != t);  
    unlock(a);  
}
```



```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```

# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    [ lock(a);  
      ...  
      assert(x != t);  
      unlock(a);  
    ]  
}
```

```
Thread2() {  
    [ lock(a);  
      t = x;  
      ...  
      x = 2;  
      unlock(a);  
    ]  
}
```

# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    [ lock(a);  
      ...  
      assert(x != t);  
      unlock(a);  
    ]  
}
```

t=0, x=1

```
Thread2() {  
    [ lock(a);  
      t = x;  
      ...  
      x = 2;  
      unlock(a);  
    ]  
}
```

**Assertion is not violated**

# Example

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
    [ lock(a);  
      ...  
      assert(x != t);  
      unlock(a);  
    ]  
}
```

```
Thread2() {  
    [ lock(a);  
      t = x;  
      ...  
      x = 2;  
      unlock(a);  
    ]  
}
```

t=1, x=2

**Assertion is not violated**

# Example after a change

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
lock(a);  
    ...  
    assert(x != t);  
unlock(a);  
}
```

```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```

# Example after a change

```
Thread1() {  
    t = 0;  
    x = 1;  
    create(Thread2);  
lock(a);  
    ...  
    assert(x != t);  
unlock(a);  
}
```

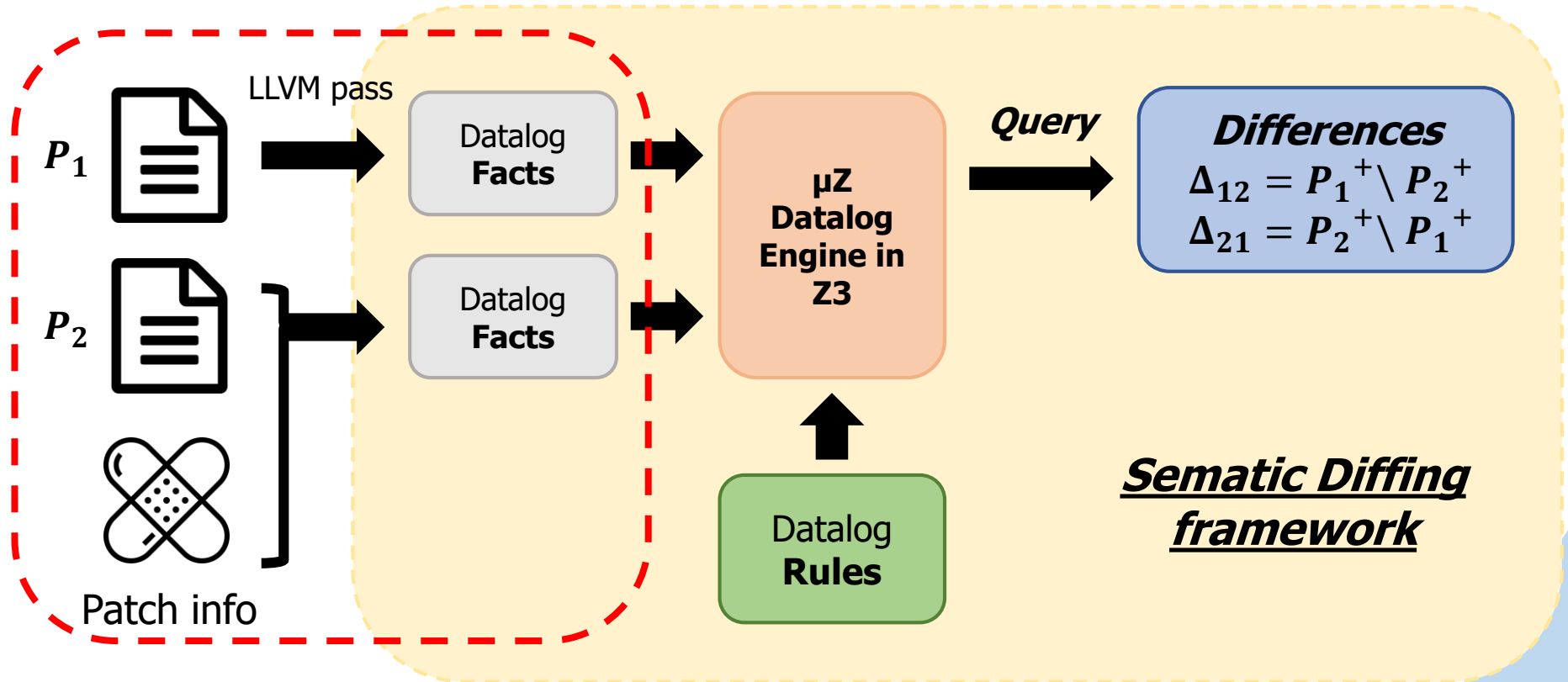
Read-from

Read-from

```
Thread2() {  
    lock(a);  
    t = x;  
    ...  
    x = 2;  
    unlock(a);  
}
```

**Assertion is violated**

# Overview



# Program Analysis in Datalog

[Whaley & Lam, 2004]

[Livshits & Lam, 2005]

**Evolving concurrent programs**



Datalog **facts**

Datalog **Rules**



**Datalog  
Engine**

**Semantic difference checking  
between the two programs**





# What is Datalog?

- Declarative language for deductive database [Ullman 1989]

## Facts

parent (bill, mary)  
parent (mary, john)

## Rules

ancestor (X, Y)  $\leftarrow$  parent (X, Y)  
ancestor (X, Y)  $\leftarrow$  parent (X, Z), ancestor (Z, Y)

**New relationship: ancestor (bill, john)**

# Datalog Translation

```
Thread1() {  
    t = 0;  
    1: x = 1;  
    ↓  
    create(Thread2);  
    lock(a);  
    ...  
    2: assert(x != t);  
    unlock(a);  
}
```

```
Thread2() {  
    lock(a);  
    3: t = x;  
    ↓  
    ...  
    4: x = 2;  
    unlock(a);  
}
```

## MustHappenBefore relations

po (s1, s2) -> MustHB (s1, s2)

ThreadOrder(s1, t1, s2, t2) ->

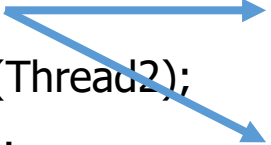
MustHB(s1, s2)

## Inferred relations

MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

# Datalog Translation

Thread1() {	Thread2() {
t = 0;	lock(a);
1: x = 1;	3: t = x;
create(Thread2);	...
lock(a);	4: x = 2;
...	unlock(a);
2: assert(x != t);	}
unlock(a);	
}	



## MustHappenBefore relations

po (s1, s2) -> MustHB (s1, s2)

ThreadOrder(s1, t1, s2, t2) ->

MustHB(s1, s2)

## Inferred relations

MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

# Datalog Translation

Thread1() { t = 0; <b>1</b> : x = 1; create(Thread2); lock(a); ... <b>2</b> : assert(x != t); unlock(a); }	Thread2() { lock(a); <b>3</b> : t = x; ... <b>4</b> : x = 2; unlock(a); }
--	---

## MayHappenBefore relations

MustHB (s1, s2) -> MayHB (s1, s2)

Not ThreadOrder(s1, t1, s2, t2) ->  
MayHB(s2, s1)

## Inferred relations

MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

MayHB: (**{1, 2}, {3, 4}, {1, 3}, {1, 4}**, {2, 3}, {2, 4},  
{3, 2}, {4, 2})

# Datalog Translation

Thread1() {  
    t = 0;  
    **1**: x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    **2**: assert(x != t);  
    unlock(a);  
}

Thread2() {  
    lock(a);  
    ...  
    **3**: t = x;  
    ...  
    **4**: x = 2;  
    unlock(a);  
}

Two blue arrows originate from the 'create(Thread2);' statement in Thread1. One arrow points to the start of Thread2, and the other points to step 3 of Thread2, indicating the creation of the thread and the start of its execution.

## MayHappenBefore relations

MustHB (s1, s2) -> MayHB (s1, s2)

Not ThreadOrder(s1, t1, s2, t2) ->  
MayHB(s2, s1)

## Inferred relations

MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

MayHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4}, **{2, 3}, {2, 4}, {3, 2}, {4, 2}**)

# Datalog Translation

```
Thread1() {  
    t = 0;  
    1: x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    2: assert(x != t);  
    unlock(a);  
}  
  
Thread2() {  
    lock(a);  
    3: t = x;  
    ...  
    4: x = 2;  
    unlock(a);  
}
```

The diagram shows two threads, Thread1 and Thread2, enclosed in a dashed box. Thread1 contains statements 1, 2, and an unlabeled statement. Thread2 contains statements 3 and 4. Arrows indicate dependencies: a blue arrow from statement 1 to statement 3, a blue arrow from statement 3 to statement 2, and a blue arrow from statement 2 to statement 4. A curved blue arrow also points from statement 1 to statement 2.

## MayReadFrom relations

MayHB (s1, s2) & St(s1) & Ld(s2) ->  
MayRF (s1, s2)

## Inferred relations

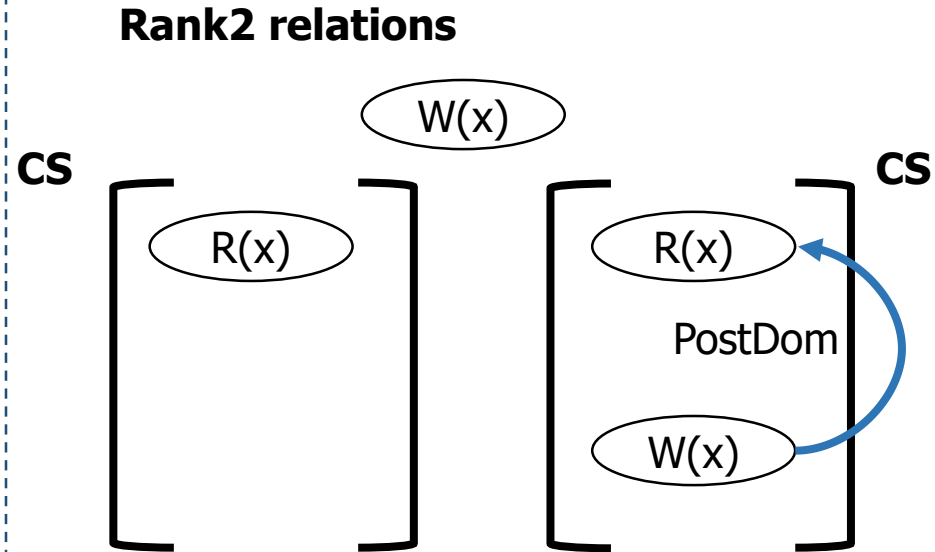
MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

MayHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4}, {2, 3}, {2, 4}, {3, 2}, {4, 2})

MayRF: ({1, 2}, {1, 3}, {3, 2}, {4, 2})

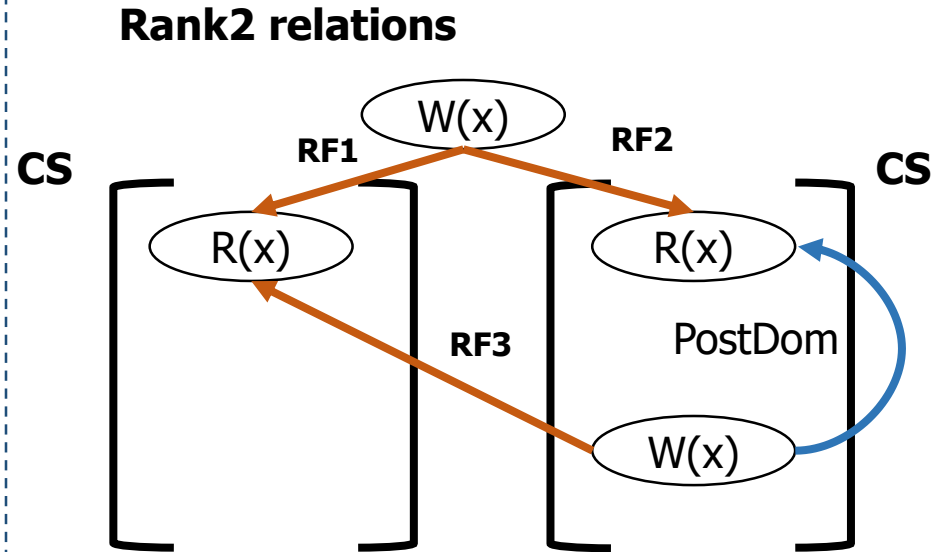
# Datalog Translation

Thread1() { t = 0; <b>1:</b> x = 1; create(Thread2); lock(a); ... <b>2:</b> assert(x != t); unlock(a); }	Thread2() { lock(a); <b>3:</b> t = x; ... <b>4:</b> x = 2; unlock(a); }
--	---



# Datalog Translation

<pre>Thread1() {   t = 0;   1: x = 1;   create(Thread2);   lock(a);   ...   2: assert(x != t);   unlock(a); }</pre>	<pre>Thread2() {   lock(a);   3: t = x;   ...   4: x = 2;   unlock(a); }</pre>
---	--





# Datalog Translation

```
Thread1() {
```

```
  t = 0;
```

```
  1: x = 1;
```

```
  create(Thread2);
```

```
  lock(a);
```

```
  ...
```

```
  2: assert(x != t);
```

```
  unlock(a);
```

```
}
```

```
Thread2() {
```

```
  lock(a);
```

```
  3: t = x;
```

```
  ...
```

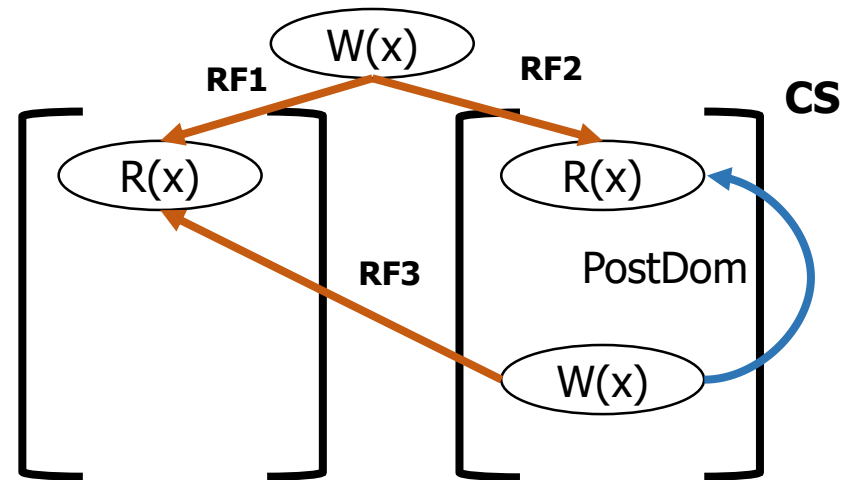
```
  4: x = 2;
```

```
  unlock(a);
```

```
}
```

CS

Rank2 relations



RF1 -> not RF3

RF2 -> not RF1

# Datalog Translation

```
Thread1() {  
    t = 0;  
    1: x = 1;  
    create(Thread2);  
    lock(a);  
    ...  
    2: assert(x != t);  
    unlock(a);  
}  
  
Thread2() {  
    lock(a);  
    3: t = x;  
    ...  
    4: x = 2;  
    unlock(a);  
}
```

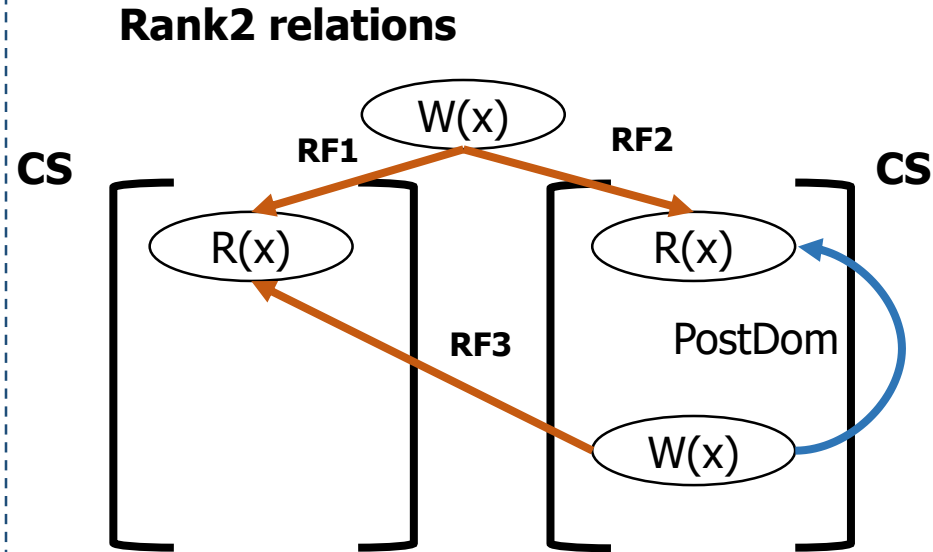
## Inferred relations

MustHB: ( $\{1, 2\}$ ,  $\{3, 4\}$ ,  $\{1, 3\}$ ,  $\{1, 4\}$ )

MayHB: ( $\{1, 2\}$ ,  $\{3, 4\}$ ,  $\{1, 3\}$ ,  $\{1, 4\}$ ,  $\{2, 3\}$ ,  $\{2, 4\}$ ,  $\{3, 2\}$ ,  $\{4, 2\}$ )

MayRF: ( $\{1, 2\}$ ,  $\{1, 3\}$ ,  $\{3, 2\}$ ,  $\{4, 2\}$ )

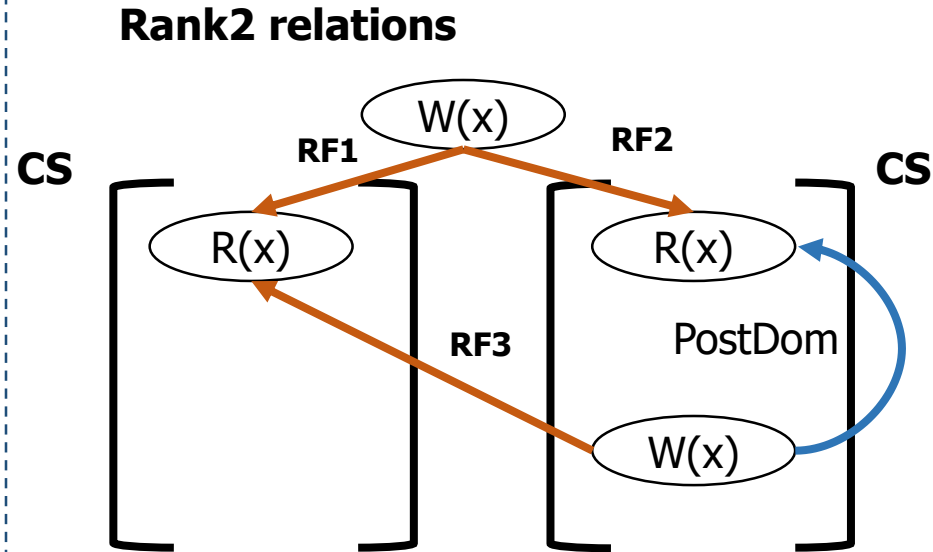
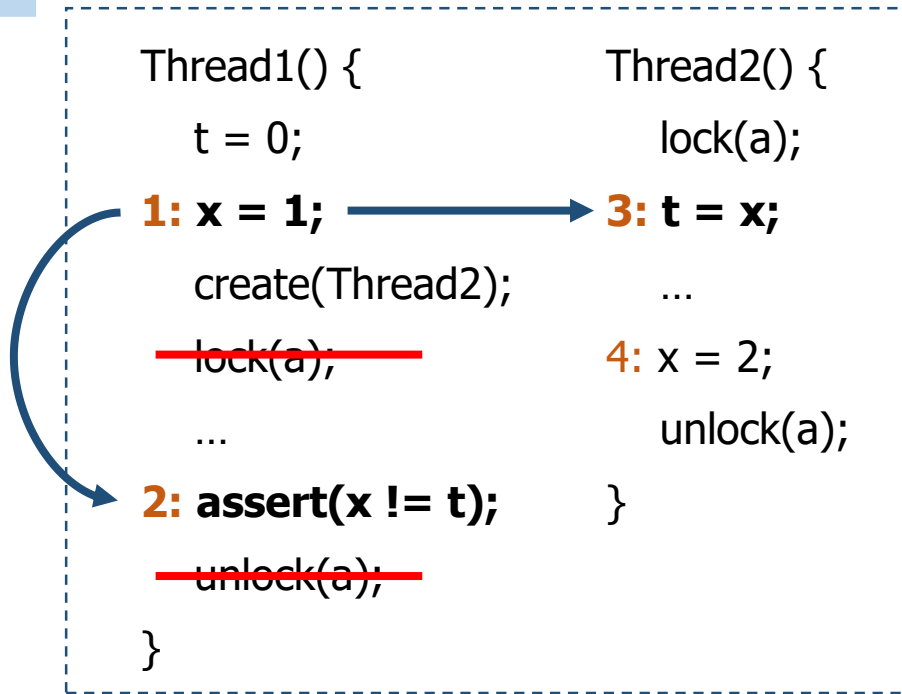
Rank2: ( $[\{1, 2\} \rightarrow \{1, 3\}]$ ,  $[\{1, 3\} \rightarrow \{4, 2\}]$ )



RF1  $\rightarrow$  not RF3

RF2  $\rightarrow$  not RF1

# Datalog Translation



RF1 -> not RF3  
RF2 -> not RF1

## Inferred relations

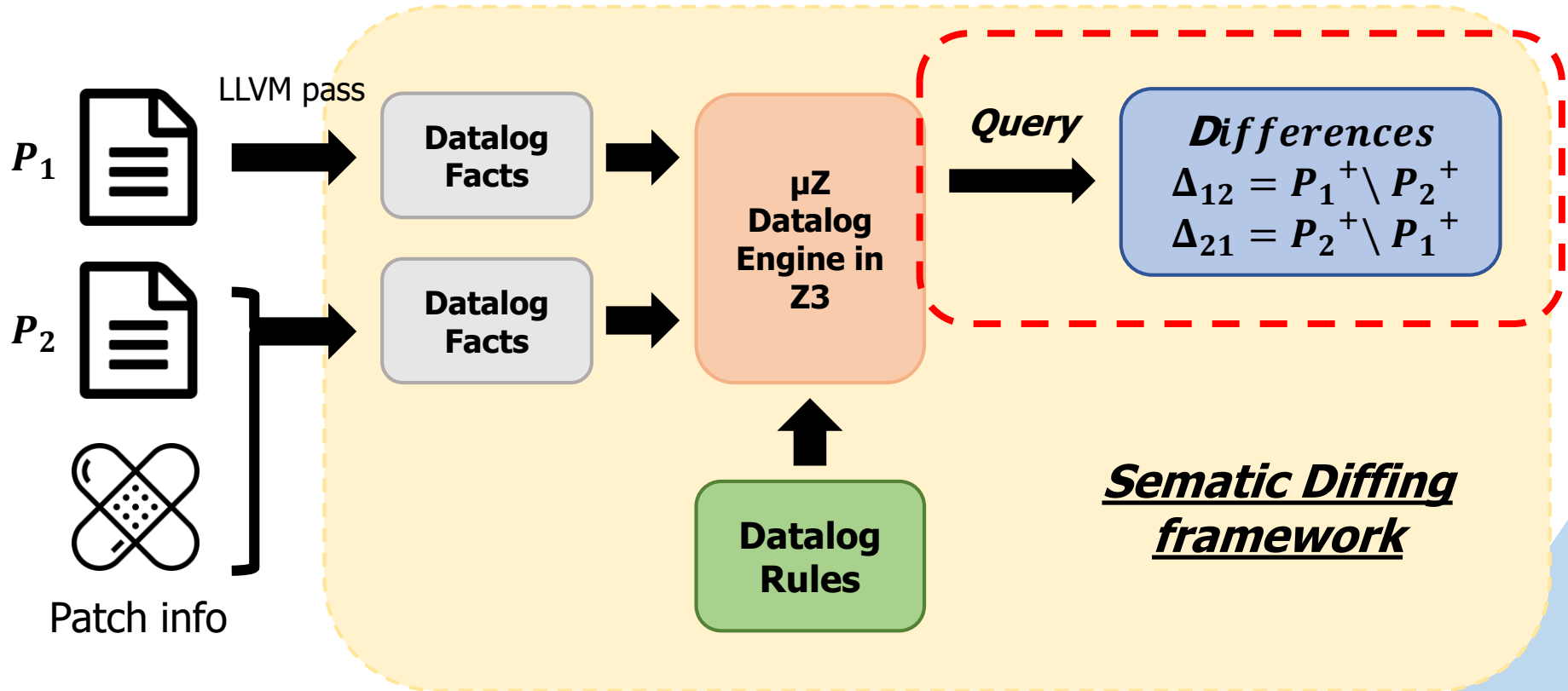
MustHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4})

MayHB: ({1, 2}, {3, 4}, {1, 3}, {1, 4}, {2, 3}, {2, 4}, {3, 2}, {4, 2})

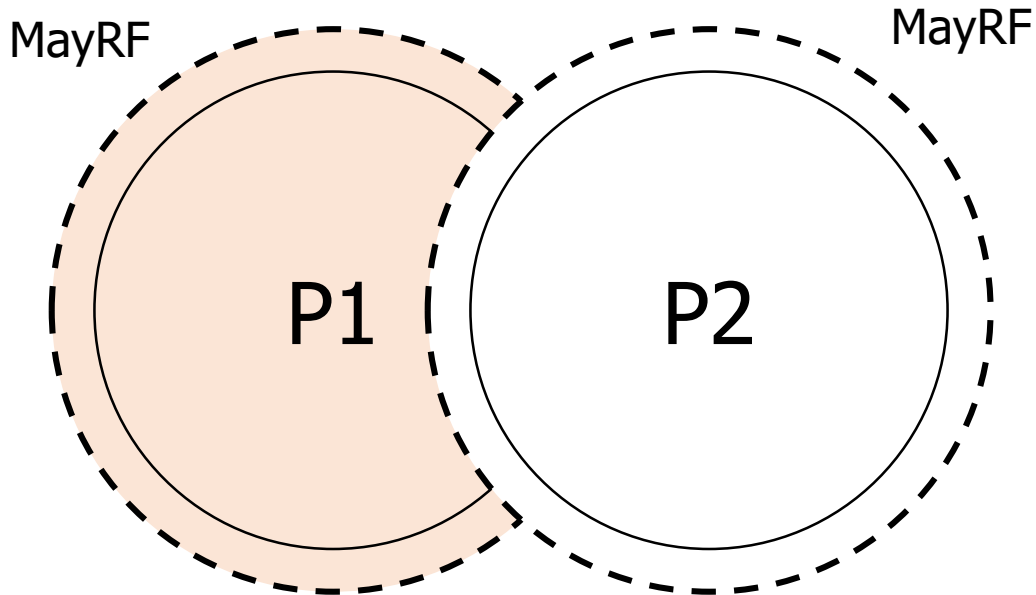
MayRF: ({1, 2}, {1, 3}, {3, 2}, {4, 2})

Rank2: ([{1, 2} -> {1, 3}], [{1, 3} -> {4, 2}], [{1, 3} -> {1, 2}])

# Overview



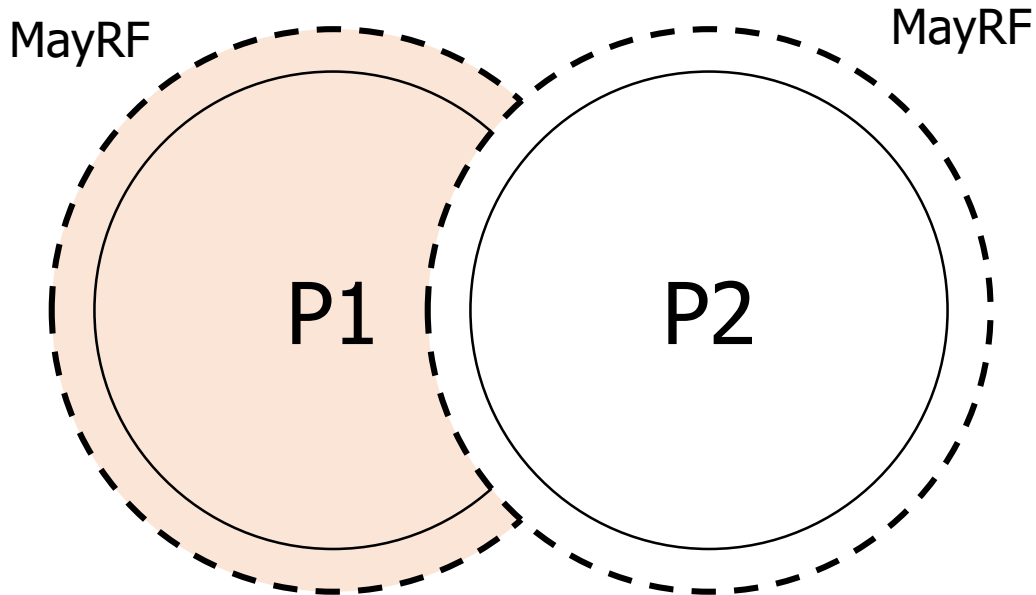
# Computing differences



**MayRF (s1, s2, p1) & Not MayRF(s1, s2 p2) -> DiffP1-P2 (s1, s2)**

**MayRF (s1, s2, p2) & Not MayRF(s1, s2 p1) -> DiffP2-P1 (s2, s1)**

# Computing differences



May be allowed in P1

$([\{1, 2\} \rightarrow \{1, 3\}], [\{1, 3\} \rightarrow \{4, 2\}])$

May be allowed in P2

$([\{1, 2\} \rightarrow \{1, 3\}], [\{1, 3\} \rightarrow \{4, 2\}], [\{1, 3\} \rightarrow \{1, 2\}])$

# Experimental Results 1

The first set	
# of apps	41
LOC	5,546
Types	Sync, Th.Order, St.Order, Cond
Sources	[Bouajjani et al. <i>SAS 2017</i> ] [Yu & Narayanasamy <i>ISCA 2009</i> ] [Beyer <i>TACAS 2015</i> ] [Bloem et al. <i>FM 2014</i> ] [Lu et al. <i>ASPLOS 2008</i> ] [Herlihy & Shavit <i>The Art of Multiprocessor Programming 2008</i> ] [Open source bug reports]

# Comparison

- Bounded Model Checking based approach

[Bouajjani et al. *SAS 2017*]



# Experimental Results 1

The first set	
Execution time of BMC-based approach	<u><i>&gt; 3 hours</i></u>
Execution time of our approach (NEW)	<u><i>15.57 seconds</i></u>
# of differences our approach found	402 dataflow edges ( <u><i>All valid</i></u> )

# Experimental Results 2

The second set	
# of apps	6
LOC	7,986
Types	Th.Order, Cond
Sources	[Yang et al. <i>U. of Utah 2008</i> [Yu & Narayanasamy <i>ISCA 2009</i> ]
BMC-based approach	<b>Not available</b>
Execution time of our approach	<b><u>140.28 seconds</u></b>
# of differences our approach found	72 ( <b><u>All valid</u></b> )

# Conclusions

- Proposed a *Datalog based* static analysis for semantic diffing concurrent programs
- *Practically accurate* for identifying differences in thread synchronization
- Significant improvement in *scalability* especially for large programs



# Thank you!

**<https://github.com/chunghasung/EC-Diff>**