

# Building Verified Program Analyzers in Coq

## Lecture 1: Motivations and Examples

David Pichardie - INRIA Rennes / Harvard University

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manual verification

yesterday

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  - find all bugs, may raise false alarms
  - ex: the Astrée static analyzer

<http://www.astree.ens.fr/>



~1M loc of a critical control-command software analyzed

0 false alarms

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sound verifiers

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tomorrow

# How do you trust the tool that verifies your software ?

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- Automatic, sound verifiers
  - find all bugs, may raise false alarms
  - ex: the Astrée static analyzer
- Formally-verified verifiers
  - the verifier comes with a soundness proof
  - that is machine checked

<http://www.astree.ens.fr/>



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verified verifiers

yesterday

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after tomorrow



# How do we verify the verifier?

# How do we verify the verifier?

A simple idea:

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**Program and prove your verifier in the same language!**

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Program and prove your verifier in the same language!

Which language ?



Coq: an animal with two faces



# Coq: an animal with two faces



First face:

# Coq: an animal with two faces



First face:

- a proof assistant that allows to interactively build proof in constructive logic



# Coq: an animal with two faces



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- a functional programming language with a very rich type system

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example:

```
sort:  $\forall$  l: list int, { l': list int |  
Sorted l'  $\wedge$  PermutationOf l l' }
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example:

```
sort:  $\forall$  l: list int, { l': list int |  
Sorted l'  $\wedge$  PermutationOf l l' }
```

- with an extraction mechanism to Ocaml

```
sort: int list  $\rightarrow$  int list
```

# Coming soon...



The next lecture will provide a short introduction to Coq

You may want to install the tool on your computer during this first lecture (but please, try to keep focused nevertheless...)

Instructions for installation:

<http://www.irisa.fr/celtique/pichardie/teaching/digicosme13>

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We program the static analyzer inside Coq

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Definition analyzer (p:program) := ...
```

Static Analyzer

Logical  
Framework  
(here Coq)



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**Definition** analyzer (p:program) := ...

We state its correctness wrt. a formal specification of the language semantics

**Theorem** analyser\_is\_sound :  
 $\forall p, \text{analyser } p = \text{Yes} \rightarrow \text{Sound}(p)$

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We interactively and mechanically prove this theorem

```
Proof. ... (* few days later *) ... Qed.
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Static Analyzer

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Soundness Proof

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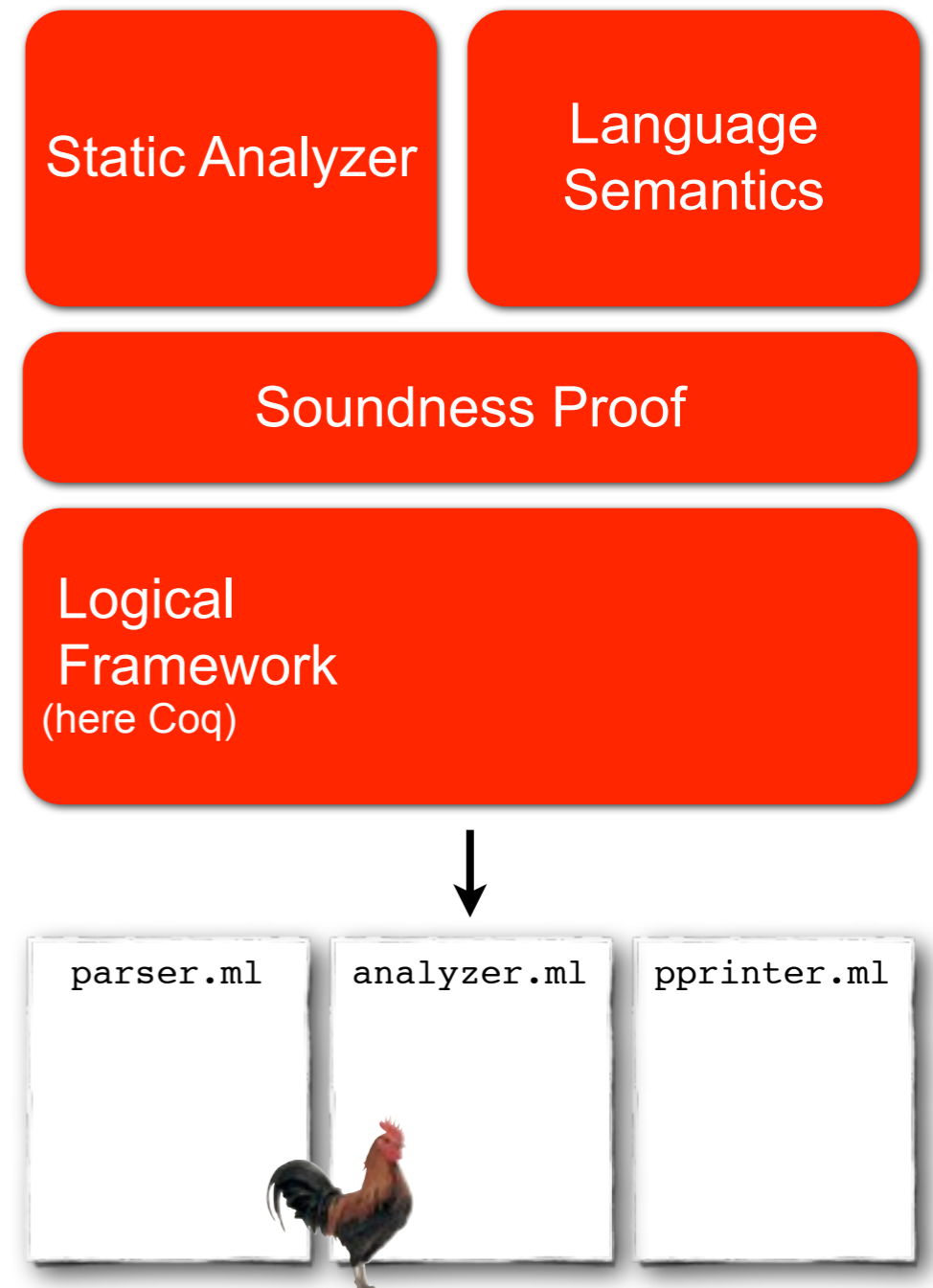
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Proof. ... (* few days later *) ... Qed.
```

We extract an OCaml implementation of the analyzer

```
Extraction analyzer.
```



# *A Posteriori* Validation

An important tool in our toolbox

We program the *full* static analyzer inside Coq

```
Definition analyzer (p:program) :=  
  ...  
  let x := complex_computation p in  
  ...
```

... or ...

# A *Posteriori* Validation

An important tool in our toolbox

We program the *full* static analyzer inside Coq

```
Definition analyzer (p:program) :=  
  ...  
  let x := complex_computation p in  
  ...
```

... or we program some parts in Coq, other parts in OCaml and use a verified validator

```
Definition analyzer (p:program) :=  
  ...  
  let x := ocaml_external_complex_computation p in  
  match validator x p with  
    | OK  $\Rightarrow$  ...  
    | Error  $\Rightarrow$  abort  
  end.
```

Ideally we also prove (on paper) that if the external implementation implements correctly a well-known algorithm then the validator will always succeed (completeness)

# Trusted Computing Base (TCB)

## 1. Formal specification of the programming language semantics

- (informally) shared by any end-user programmer, compiler, static analyzer
- less specialized than static analyzer's abstract semantics

## 2. Logical Framework

- only the proof checker needs to be trusted
- we don't trust sophisticated decision procedures

Static Analyzer

Language Semantics

Soundness Proof

Logical Framework  
(here Coq)

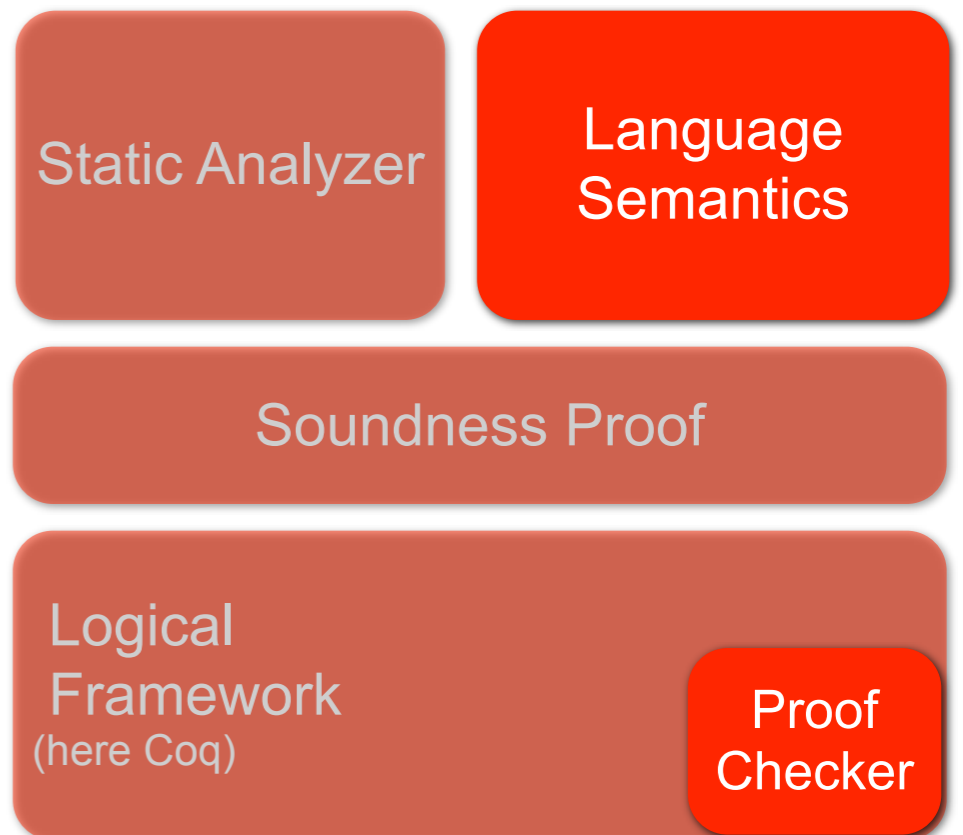
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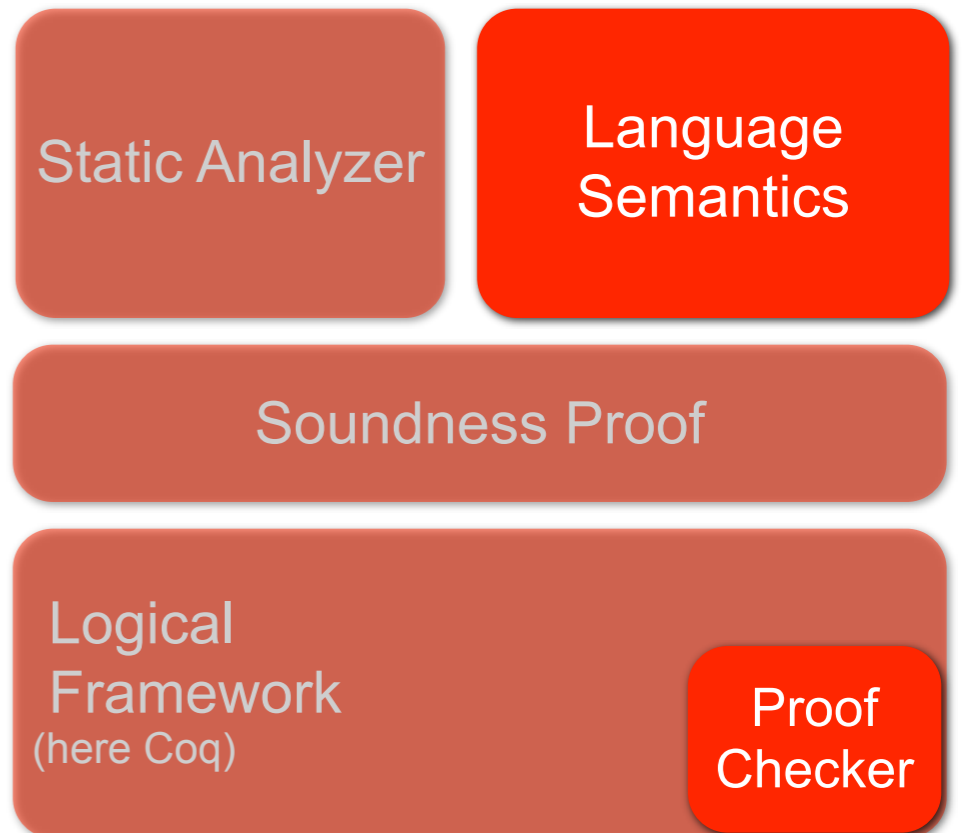
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Still a large code base but at least a *foundational* code base: logic & semantics



# Using Proof Assistants in PL Research

We distinguish two approaches

1. Accompany a research paper with a machine checked proof
  - increase the trust in a scientific result
  - facilitate the review process
2. Help building highly reliable *meta-programs* (programs that manipulate programs: compilers, program verifiers, type checkers...)
  - require to program the tool inside the proof assistant (generic interface, efficient data-structures)
  - must scale to realistic languages with large formal semantics

# Verified PL Stacks: Achievements

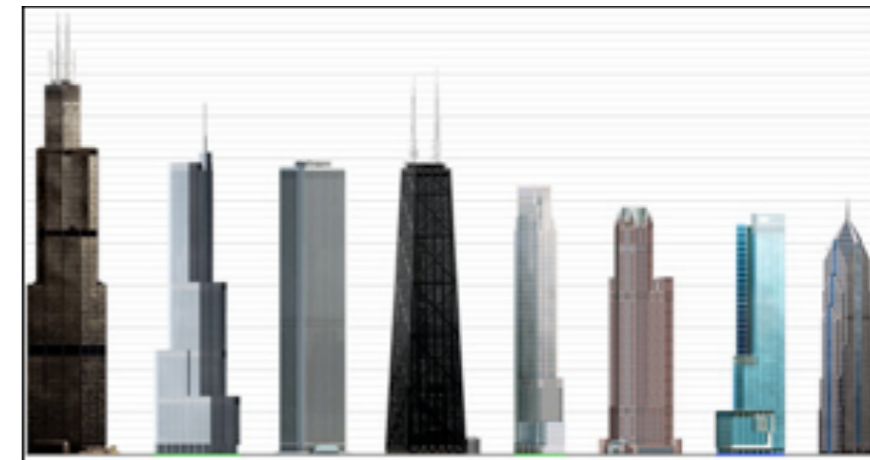
Some major achievements have changed our expectations about programming language mechanized proofs

- M6: JVM bytecode interpreter in ACL2 (Liu)
- Jinja: source & bytecode Java, compiler, BCV in Isabelle/HOL (Klein & Nipkow, and extensions by Lochbihler)
- CompCert: realistic C compiler in Coq (Leroy, Blazy et al.)
- Verified Software ToolChain: extension of CompCert for concurrent C programs (Appel et al.)
- seL4: verified OS kernel in Isabelle/HOL (Klein, Norrish et al.)

# Verified Static Analysis: Objectives

We identify two major objectives

1. building new proof methods for the working (mechanized) semanticist
  - using Abstract Interpretation theory, we can provide generic interfaces between analyses
  - we have to discover new *a posteriori* validation algorithms (sound and efficient)
2. building big proofs
  - proving in the small will not give us all the lessons we want to learn
  - large case studies are important to build a new *proof engineering* knowledge



# These Lectures

## Lecture 1

Motivations

Examples of verified analysers

## Lecture 2

Coq crash course

## Lecture 3

Verified abstract interpreter for a simple imperative language

## Lecture 4

CompCert

A verified value analysis for CompCert

# Some example of verified static analysers

## Lecture objectives

- Show examples of challenging verified static analysis
- Complement your knowledge on static analysis

## Two examples

- Information flow type system
- data-race static analysis

These analyses target the Java (bytecode) language

# A Certified Non-Interference Java Bytecode Verifier

G. Barthe, D. Pichardie and T. Rezk, A Certified Lightweight Non-Interference  
Java Bytecode Verifier, ESOP'07

# Motivations: Bytecode Verification

## Java bytecode verification

- checks that applets are correctly formed and correctly typed,
- using a static analysis of bytecode programs

## But Java bytecode verifier (and more generally Java security model)

- only concentrates on who accesses sensitive information,
- not how sensitive information flows through programs

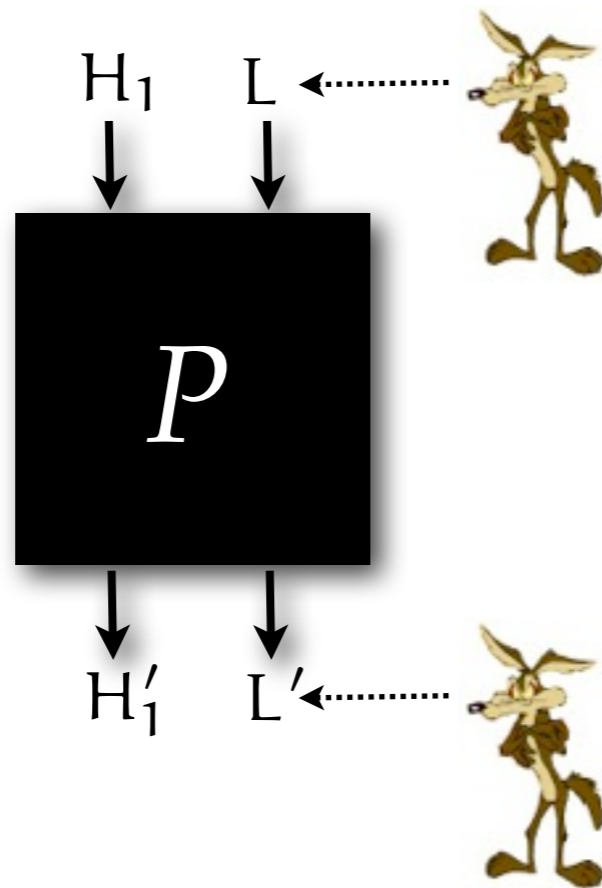
## In this work

- We propose an information flow type system for a sequential JVM-like language, including classes, objects, arrays, exceptions and method calls.
- We prove in Coq that it guarantees the semantical non-interference property on method input/output.

# Non-Interference

*“Low-security behavior of the program is not affected by any high-security data.”* Goguen&Meseguer 1982

High = secret  
Low = public

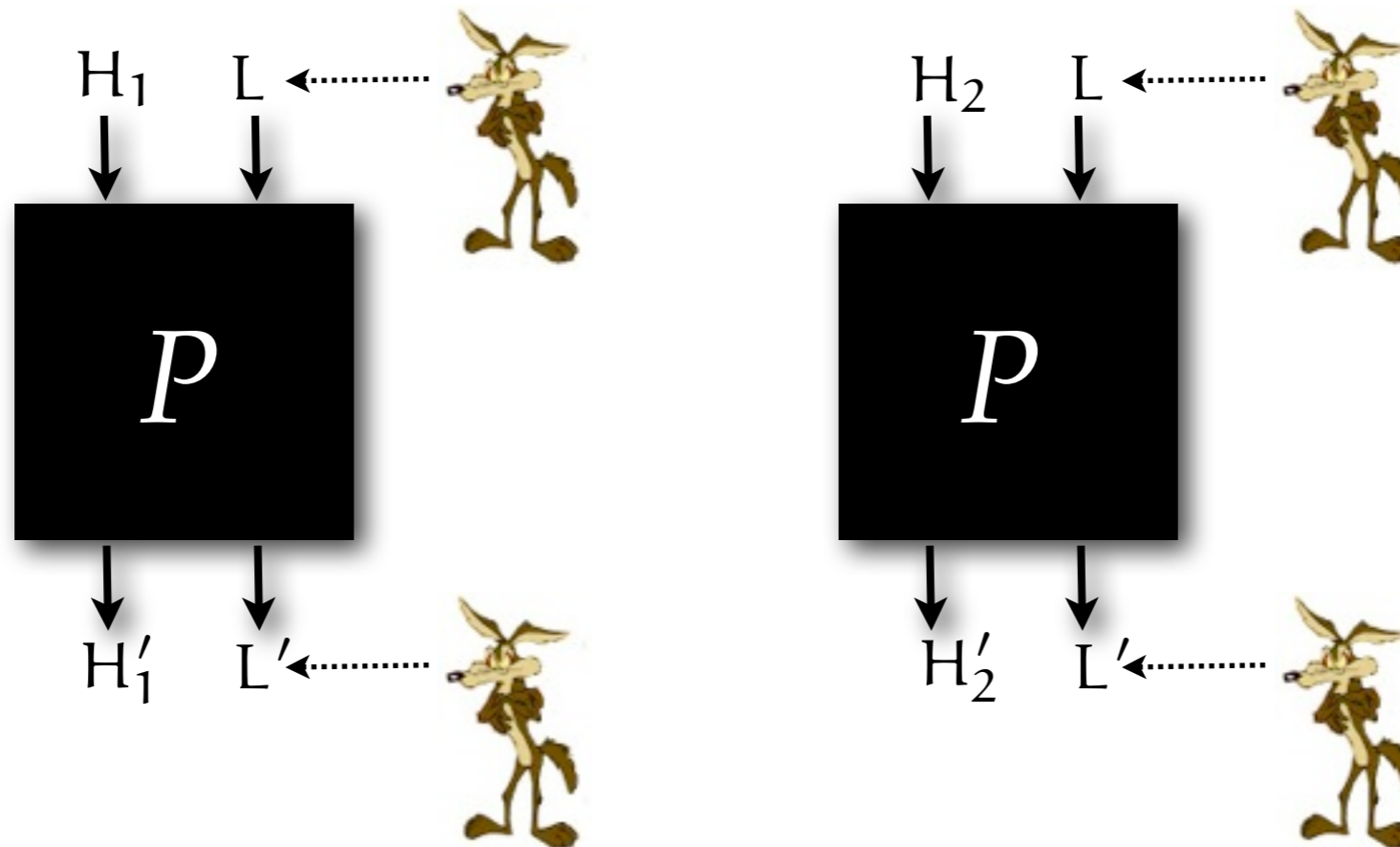




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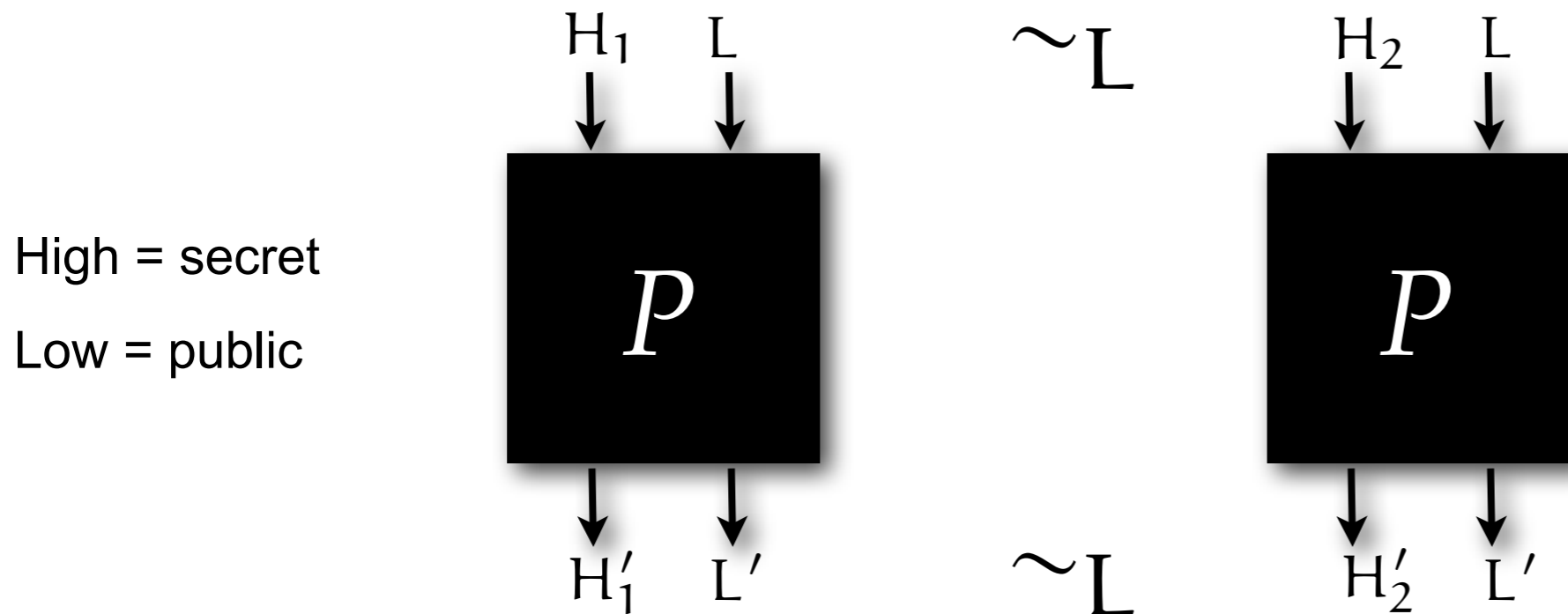
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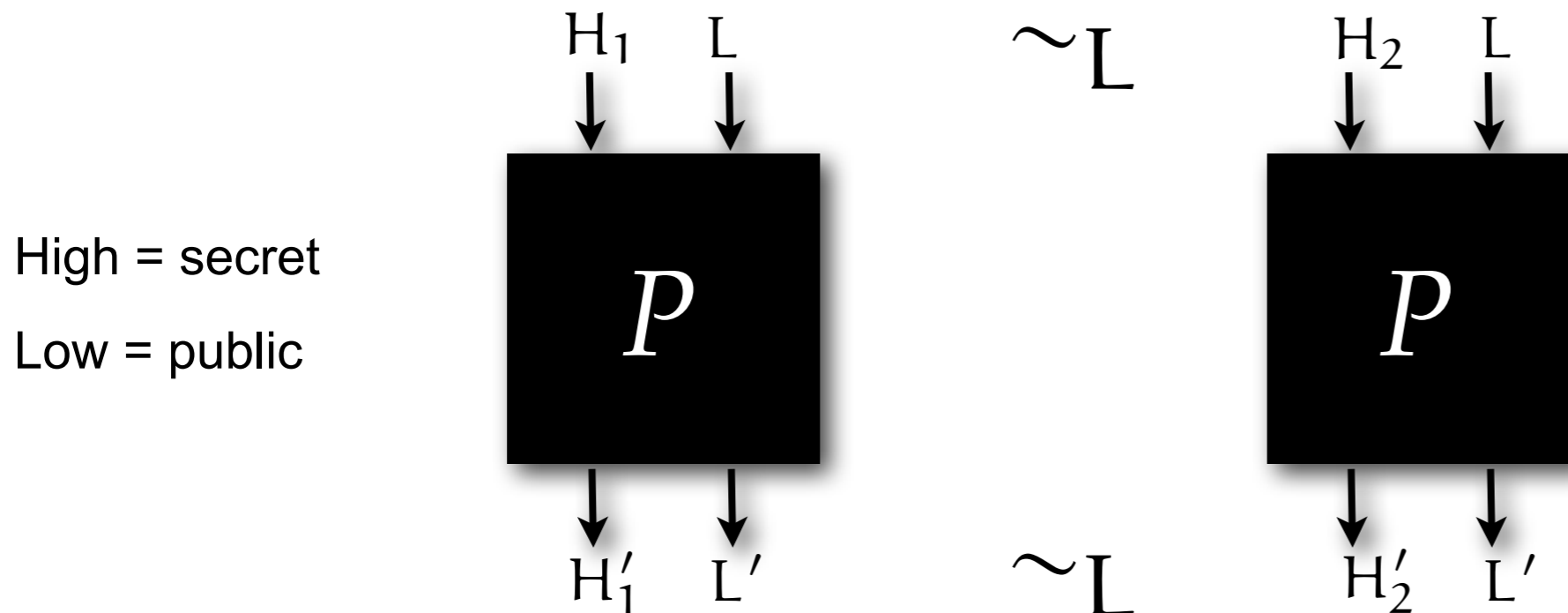
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$$\forall s_1 s_2, s_1 \sim_L s_2 \implies \llbracket P \rrbracket(s_1) \sim_L \llbracket P \rrbracket(s_2)$$

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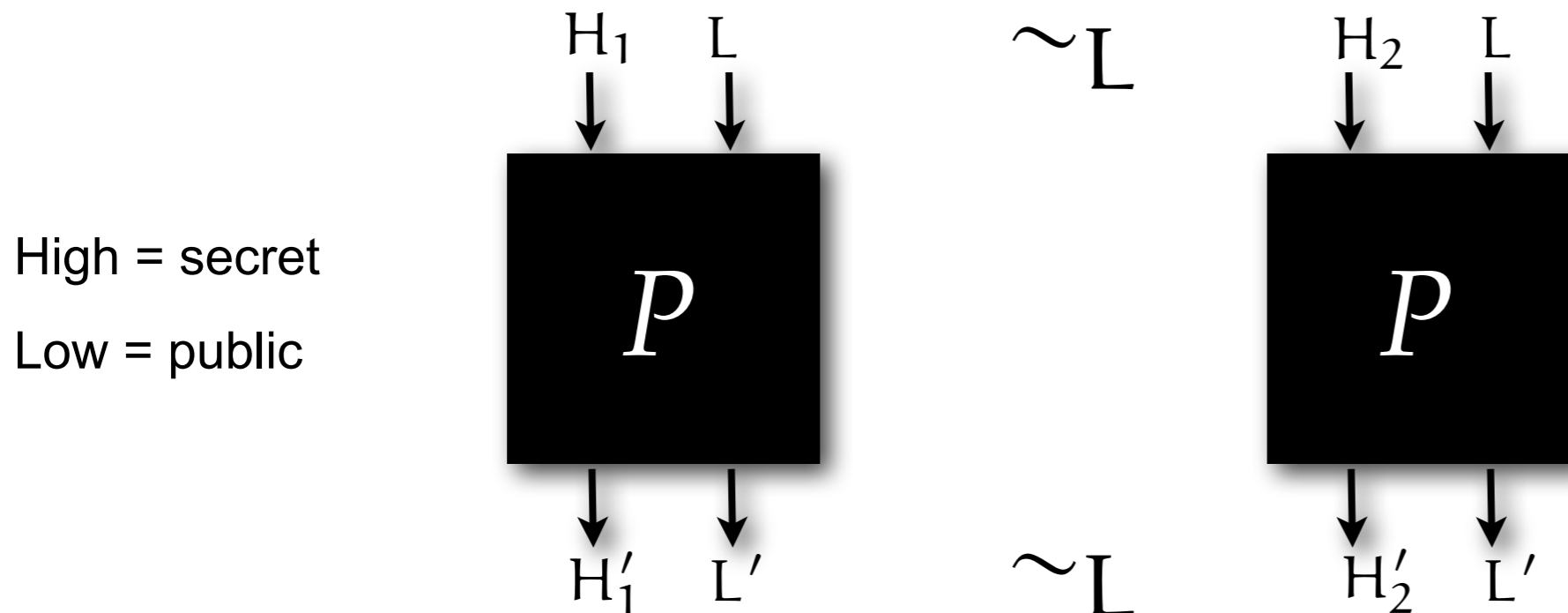


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if inputs are equivalent for the attacker...

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$$\forall s_1 s_2, s_1 \sim_L s_2 \implies [[P]](s_1) \sim_L [[P]](s_2)$$

if inputs are equivalent for the attacker...

...outputs should be equivalent too.

# Example of information leaks

Explicit flow:

```
public int{L} foo(int{L} l; int{H} h) {  
    return h;  
}
```

Implicit flow:

```
public int{L} foo(int{L} l1; int{L} l2; int{H} h) {  
    if (h==0) {return l1;} else {return l2;};  
}
```

We use here the Jif (<http://www.cs.cornell.edu/jif>) syntax:

- a security-typed extension of Java (source) with support for information flow.

# Information flow type systems

## Previous work

- Non-interference can be enforced by a type system [Volpano97]
- The type system is sound: it rejects every interferent programs

$$\textit{WellTyped}(P) \implies \textit{NonInterferent}(P)$$

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D. Volpano and G. Smith, *A Type-Based Approach to Program Security*,  
Theory and Practice of Software Development, 1997.

$$\begin{array}{c} \text{CONST} \frac{}{\vdash n : L} \quad \text{VAR} \frac{x \in \mathbb{V}_\tau}{\vdash x : \tau} \quad \text{BINOP} \frac{\vdash e_1 : \tau \quad \vdash e_2 : \tau}{\vdash e_1 \circ e_2 : \tau} \\ \\ \text{EXP-SUBTYP} \frac{\vdash e : \tau_1 \quad \tau_1 \sqsubseteq \tau_2}{\vdash e : \tau_2} \\ \\ \text{ASSIGN} \frac{x \in \mathbb{V}_\tau \quad \vdash e : \tau}{\vdash x := e : \tau} \quad \text{SEQ} \frac{\vdash S_1 : \tau \quad \vdash S_2 : \tau}{\vdash S_1 ; S_2 : \tau} \\ \\ \text{IF} \frac{\vdash e : \tau \quad \vdash S_1 : \tau \quad \vdash S_2 : \tau}{\vdash \text{if } e \text{ then } S_1 \text{ else } S_2 : \tau} \quad \text{WHILE} \frac{\vdash e : \tau \quad \vdash S : \tau}{\vdash \text{while } e \text{ do } S : \tau} \\ \\ \text{STM-SUBTYP} \frac{\vdash S : \tau_2 \quad \tau_1 \sqsubseteq \tau_2}{\vdash S : \tau_1} \end{array}$$

# Information flow type systems

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## Achievements: mechanized proof of a type checker for a bytecode language handling

- unstructured control flow
- operand stack
- exceptions
- objects and array dynamically allocated
- classes and virtual method calls

## (Preliminary) experiments:

- we have extracted the type checker and used it on a small case study

```
| vaload_np_caught : forall i te t k1 k2 ke st,  
  (forall j, region i (Some np) j -> k2 <= se j) ->  
  handler i np = Some te ->  
  texec i (Vaload t) (Some np) (L.Simple k1::L.Array k2 ke::st) (Some (L.Simple k2::nil))  
| vaload_np_uncaught : forall i te t k1 k2 ke st,  
  (forall j, region i (Some np) j -> k2 <= se j) ->  
  k2 <= sgn.(resExceptionType) np ->  
  handler i np = None ->  
  texec i (Vaload t) (Some np) (L.Simple k1::L.Array k2 ke::st) None  
| vaload_iob_caught : forall i te t k1 k2 ke st,  
  (forall j, region i (Some iob) j -> k1 U k2 <= se j) ->  
  handler i iob = Some te ->  
  texec i (Vaload t) (Some iob) (L.Simple k1::L.Array k2 ke::st) (Some (L.Simple (k1 U k2)))  
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  (forall j, region i (Some iob) j -> k1 U k2 <= se j) ->  
  k1 U k2 <= sgn.(resExceptionType) iob ->  
  handler i iob = None ->  
  texec i (Vaload t) (Some iob) (L.Simple k1::L.Array k2 ke::st) None  
| vstore : forall i t kv ki ka ke st,  
  kv <=' ke ->  
  ki <= ke ->  
  (forall j, region i None j -> ka <= se j) ->  
  (forall j, region i None j -> (L.join ki ka) <= (se j)) ->  
  (forall j, region i None j -> ke <= (se j)) ->  
  L.leql' kv (sgn.(resExceptionType) ke) ->  
  texec i (Vstore t) None (kv::L.Simple ki::L.Array ka ke::st) (Some (elift m i ke st))  
| vstore_np_caught : forall i te t kv ki ka ke st,  
  (forall j, region i (Some np) j -> ka <= se j) ->  
  handler i np = Some te ->  
  texec i (Vstore t) (Some np) (kv::L.Simple ki::L.Array ka ke::st) (Some (L.Simple ka::nil))  
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  (forall j, region i (Some np) j -> ka <= se j) ->  
  ka <= sgn.(resExceptionType) np ->  
  handler i np = None ->  
  texec i (Vstore t) (Some np) (kv::L.Simple ki::L.Array ka ke::st) None  
| vstore_ase_caught : forall i te t kv ki ka ke st,  
  (forall j, region i (Some ase) j -> (L.join kv (L.join ki ka)) <= se j) ->  
  handler i ase = Some te ->  
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  (Some (L.Simple (L.join kv (L.join ki ka))::nil))  
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  texec i (Vstore t) (Some iob) (kv::L.Simple ki::L.Array ka ke::st) None  
| vload : forall i t x st,  
  texec i (Vload t x) None st (Some (L.join' (se i) (sgn.(lvt) x)::st))  
| vstore : forall i t x k st,  
  se i <= sgn.(lvt) x ->  
  L.leql' k (sgn.(lvt) x) ->  
  texec i (Vstore t x) None (k::st) (Some st)  
| vreturn : forall i x k kv st,  
  sgn.(resType) = Some kv ->  
  L.leql' k kv ->  
  texec i (Vreturn x) None (k::st) None.
```

66 typing rules...



# Some reading

A. Myers. *Expressing and Enforcing Security with Programming Languages*. PLDI'06 tutorial.

A. Sabelfeld and A. Myers. *Language-Based Information-Flow Security*. IEEE Journal on Selected Areas in Communication, 2003

D. Volpano and G. Smith. *A Type-Based Approach to Program Security*. Theory and Practice of Software Development, 1997

A. Sabelfeld and D. Sands. *Declassification: Dimensions and principles*. Journal of Computer Security, 2009.

T. H. Austin and C. Flanagan. *Efficient purely-dynamic information flow analysis*. PLAS 2009

# A Certified Data Race Analysis for Java Bytecode

F. Dabrowski and D. Pichardie, A Certified Data Race Analysis for a Java-like Language, TPHOLs 2009

# Data Races

A fundamental issue in multi-threaded programming

Definition: *the situation where two different processes attempt to access to the same memory location and at least one access is a write.*

Leads to tricky bugs

- difficult to reproduce and identify via manual code review or program testing

Wanted: sequentially consistent (SC) executions

- each thread accesses instantly a common shared memory
- the execution can be modelled with an interleaving of thread actions

The Java specification gives very surprising semantics to programs with races

- Only data-race-free programs are guaranteed to have only SC executions

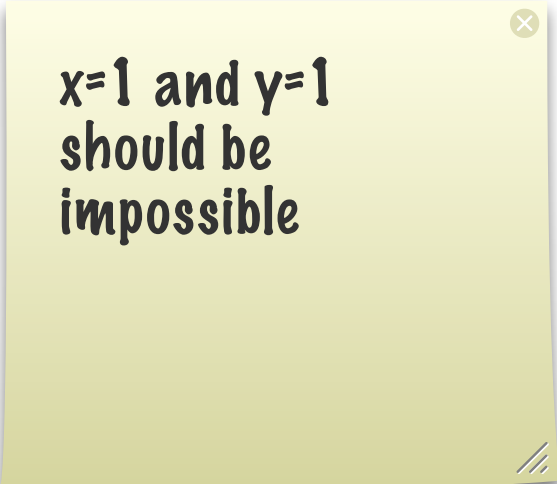
# Example

```
C.f = C.g = 0;  
1: x = C.g; || 1: y = C.f;  
2: C.f = 1; || 2: C.g = 1;
```

x=1 and y=1  
should be  
impossible

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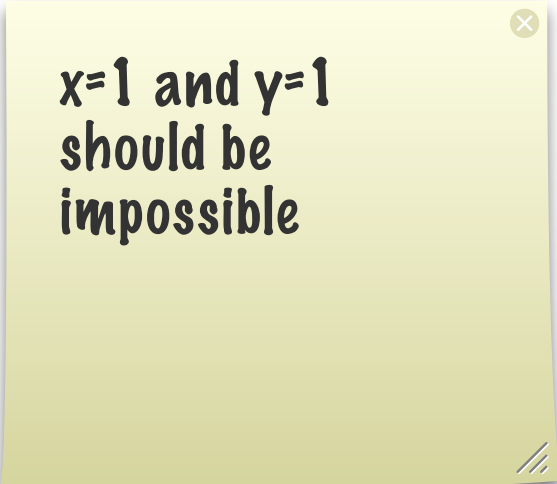


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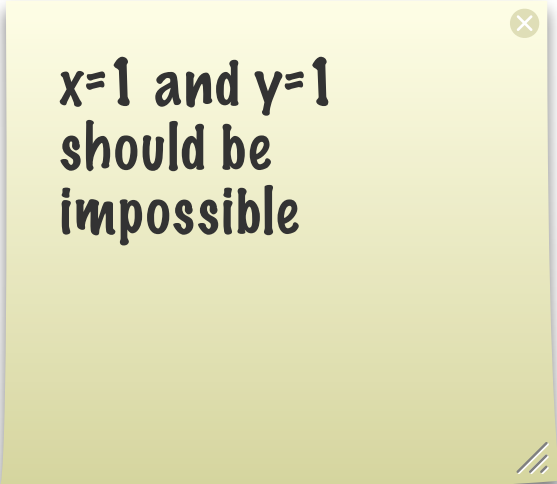
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2: C.f = 1;	2: C.g = 1;	1: x = C.g;	...
1: y = C.f;	1: x = C.g;	2: C.g = 1;	
2: C.g = 1;	2: C.f = 1;	2: C.f = 1;	



# Example

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2: C.f = 1;	2: C.g = 1;	1: x = C.g;	...	2: C.f = 1;
1: y = C.f;	1: x = C.g;	2: C.g = 1;	...	1: x = C.g;
2: C.g = 1;	2: C.f = 1;	2: C.f = 1;	...	1: y = C.f;

✓ ✓ ✓ ✗

✗ x=1 and y=1  
is a legal outcome  
according to Java  
specification!

but such program may also lead to sequentially inconsistent execution

Origins:

- Multicore cache mechanisms
- Aggressive compiler optimizations

# Java Data-Race-Free Guarantee

The Java specification guarantees that if all SC execution of a program are race-free then the program will only exhibit these executions

A data-race verifier must infer automatically that a program is race free

- the verifier computes a set of potential races

$$\text{verifier}_{\text{DR}} : \text{program} \rightarrow \mathcal{P}(\text{races})$$

- if this set is empty, the program must be free of races

$$\text{verifier}_{\text{DR}}(P) = \emptyset \implies \text{Races}(P) = \emptyset$$

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computable

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- if this set is empty, the program must be free of races

$$\text{verifier}_{\text{DR}}(P) = \emptyset \implies \text{Races}(P) = \emptyset$$

computable

not-computable

# Data Race Analysis

## A Challenging Example

```
class List{ T val; List next; }

class Main() {
  void main(){
    List l = null;
    while (*) {
      List temp = new List();
1:   temp.val = new T();
2:   temp.val.f = new A();
3:   temp.next = l;
      l = temp }
    while (*) {
      T t = new T();
4:   t.data = l;
      t.start();
5:   t.f = ...;}
    return;
  }
}

class T extends java.lang.Thread {
  A f;
  List data;
  void run(){
    while(*){
6:   List m = this.data;
7:   while (*) { m = m.next; }
8:   synchronized(m){ m.val.f = ...;}}
    return;}}}
```

# Data Race Analysis

## A Challenging Example

```
class List{ T val; List next; }

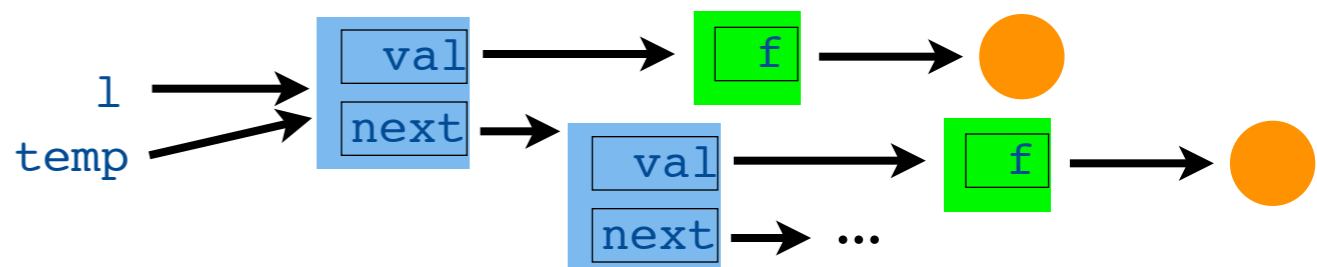
class Main() {
  void main(){
    List l = null;
    while (*) {
      List temp = new List();
1:   temp.val = new T();
2:   temp.val.f = new A();
3:   temp.next = l;
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```

I. We create a link list  $l$

Threads:  $\diamond M$



# Data Race Analysis

## A Challenging Example

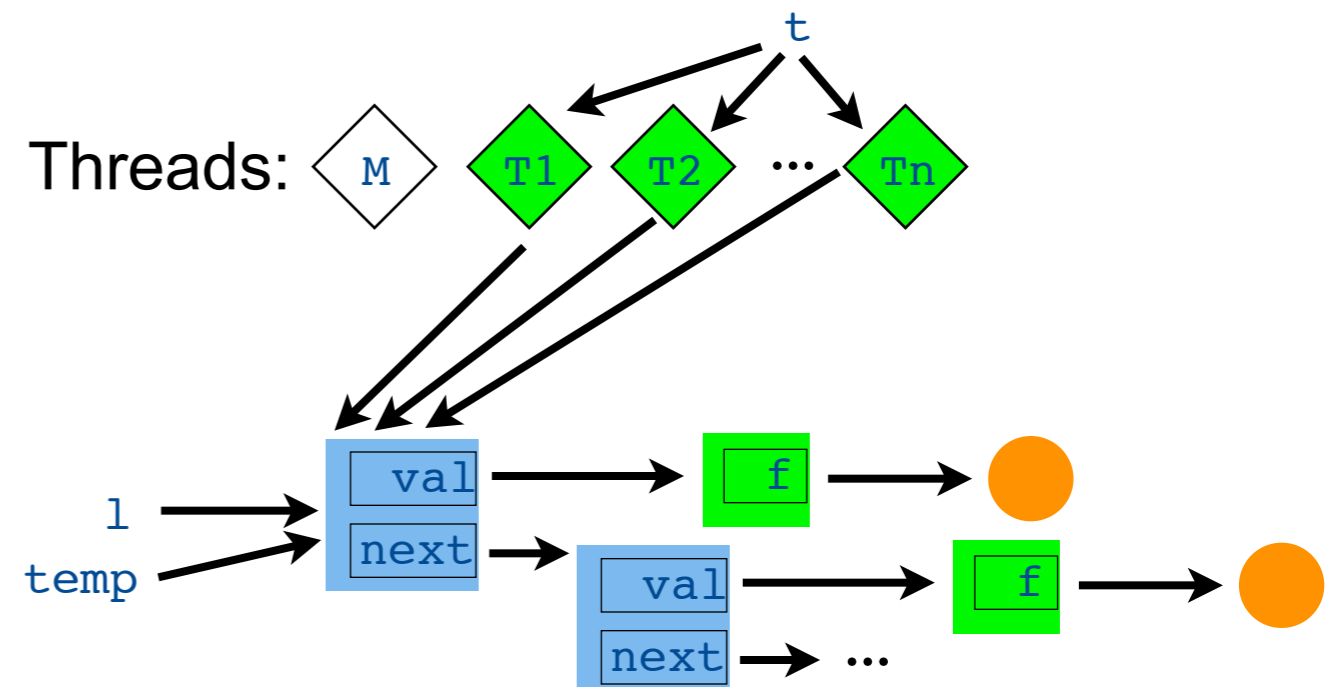
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      List temp = new List();
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3:   temp.next = l;
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      T t = new T();
      t.data = l;
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```

1. We create a link list  $l$
2. We create several threads that all share the list  $l$



# Data Race Analysis

## A Challenging Example

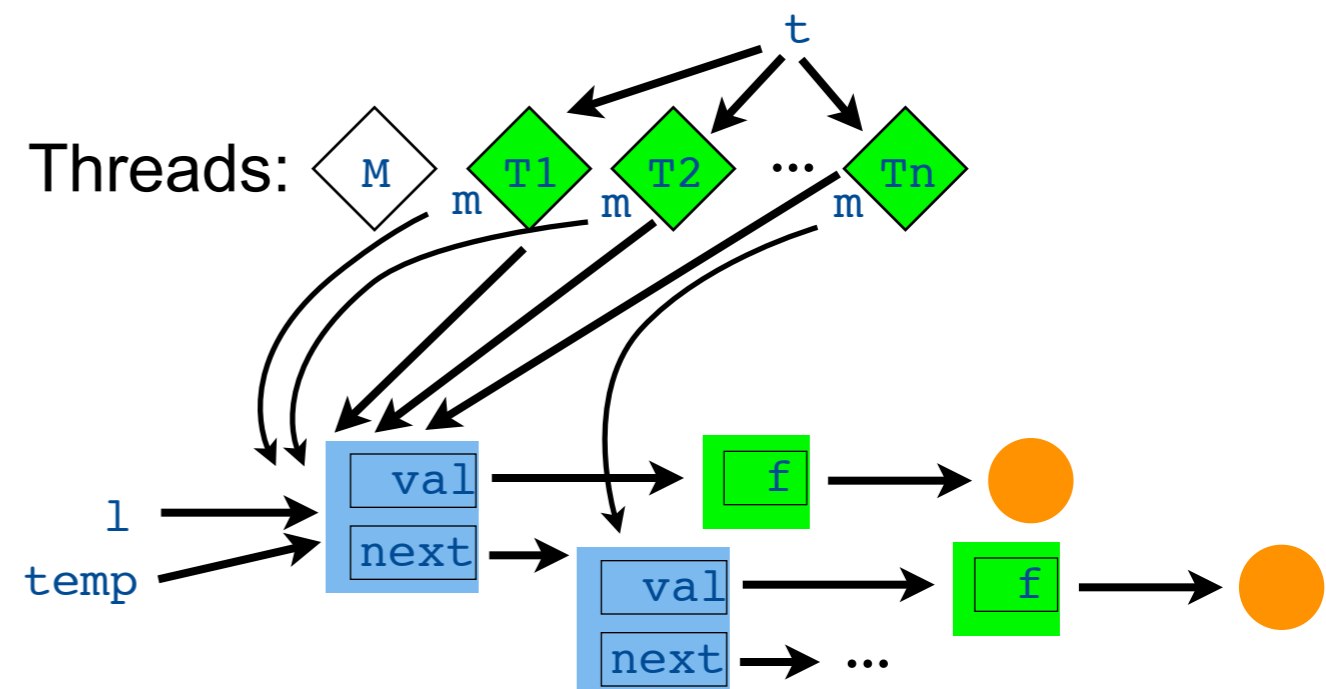
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    List l = null;
    while (*) {
      List temp = new List();
1:   temp.val = new T();
2:   temp.val.f = new A();
3:   temp.next = l;
      l = temp }
    while (*) {
      T t = new T();
4:   t.data = l;
      t.start();
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```

1. We create a link list  $l$
2. We create several threads that all share the list  $l$
3. Each thread chooses a cell, takes a lock on it and updates it.





# Data Race Analysis

## A Challenging Example

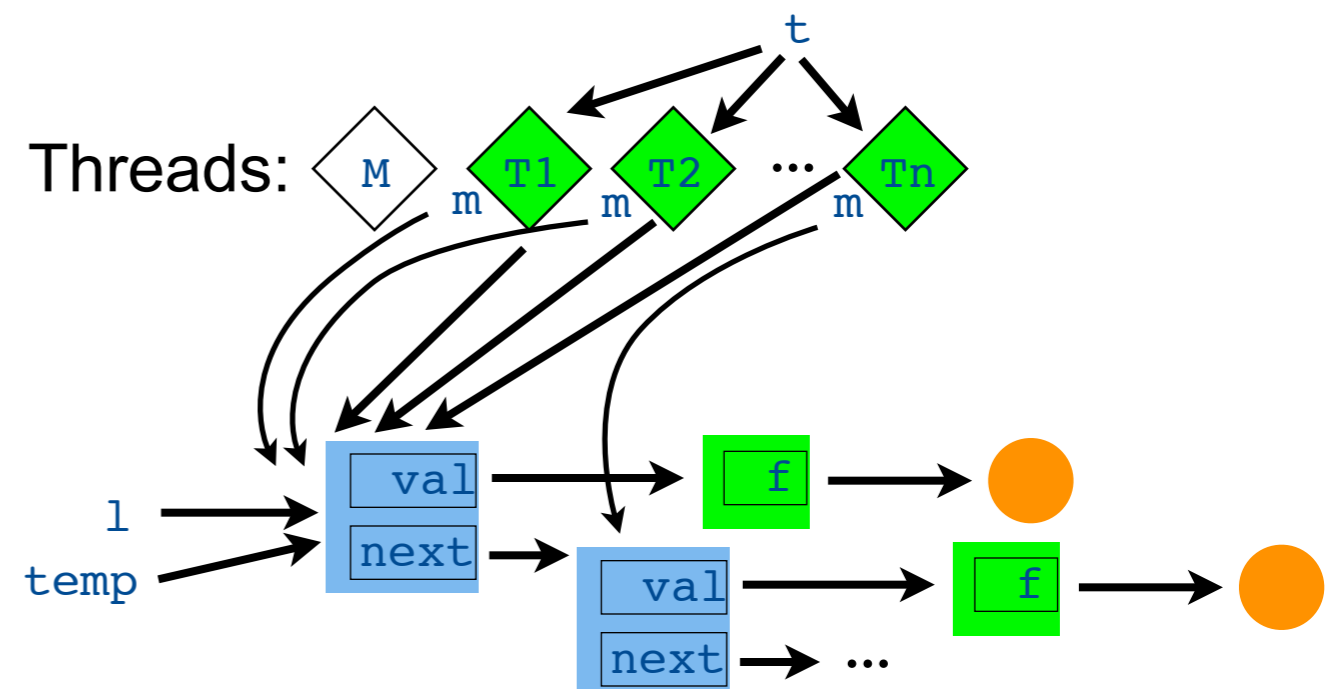
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    while (*) {
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```

1. We create a link list  $l$
2. We create several threads that all share the list  $l$
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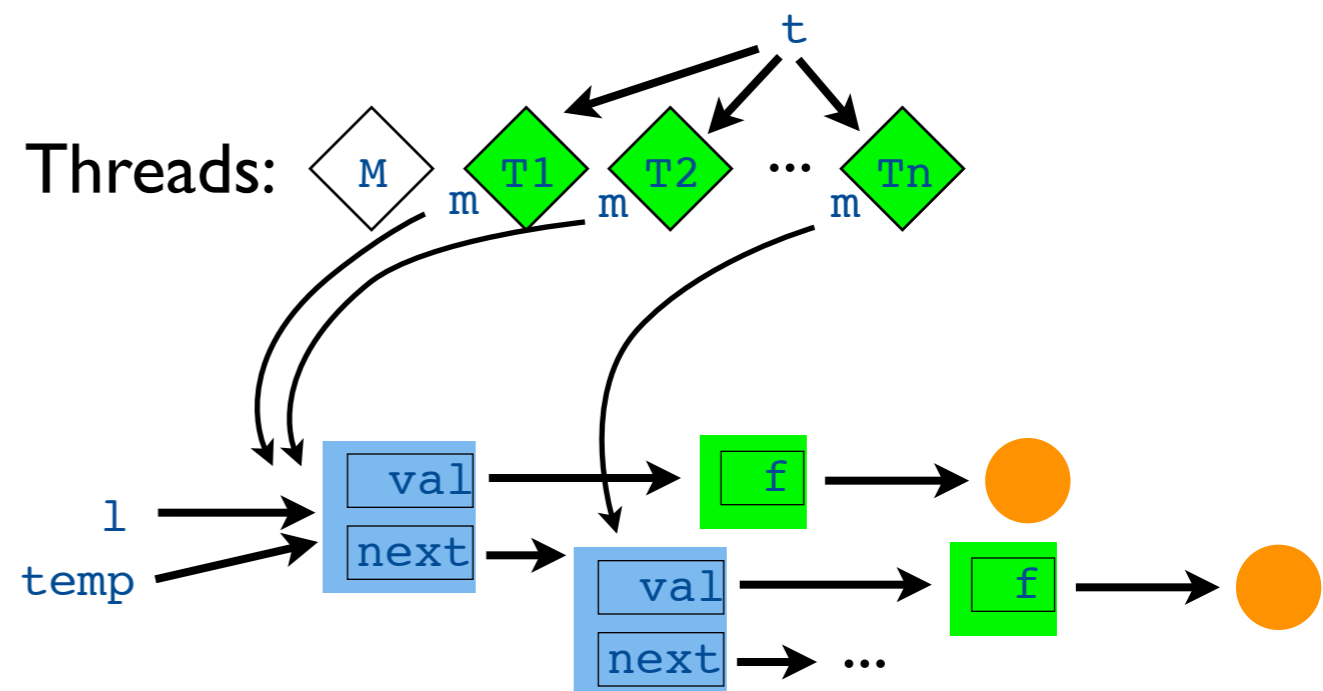
# Points-to abstraction

```
class List{ T val; List next; }

class Main() {
  void main(){
    List l = null;
    while (*) {
      [h1] List temp = new List();
1: [h2] temp.val = new T();
2: [h3] temp.val.f = new A();
3:   temp.next = l;
      l = temp }
    while (*) {
      [h4] T t = new T();
4:   t.data = l;
      t.start();
5:   t.f = ...;}
    return;
  }
}

class T extends java.lang.Thread {
  A f;
  List data;
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6:   List m = this.data;
7:   while (*) { m = m.next; }
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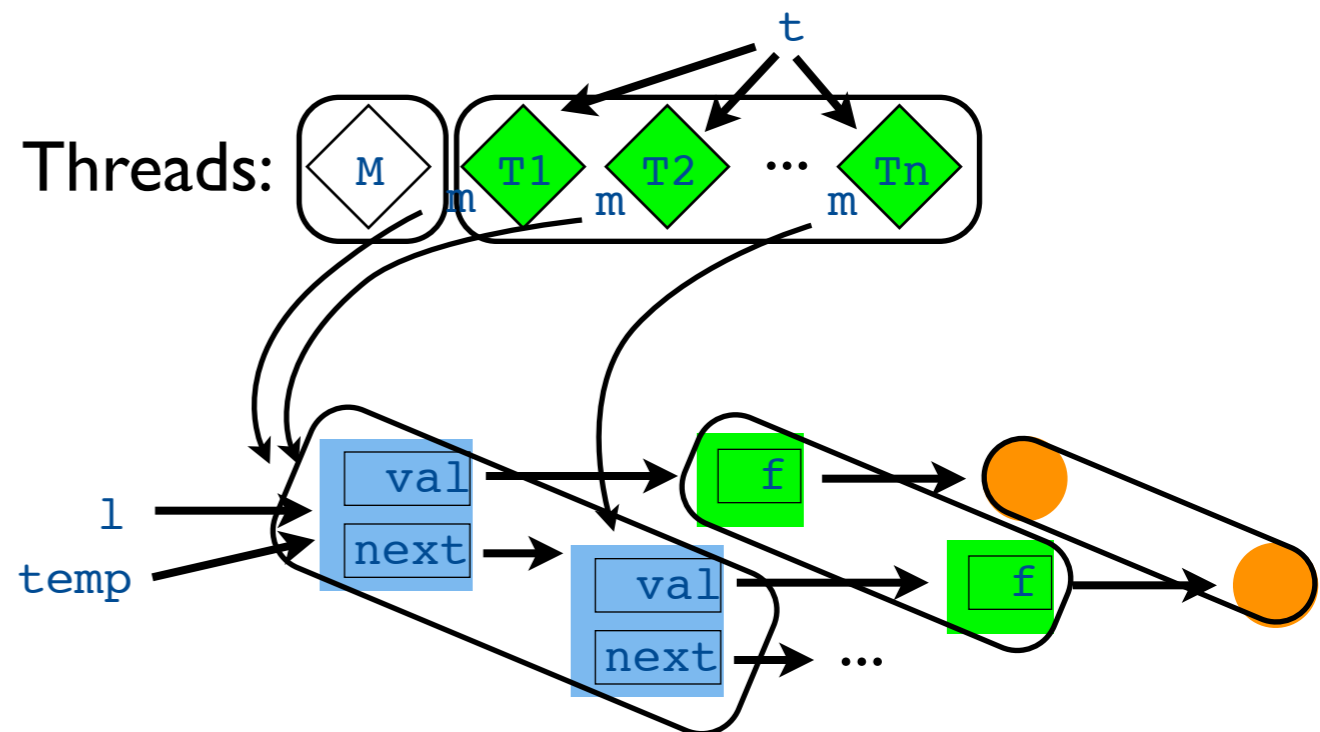


# Points-to abstraction

```
class List{ T val; List next; }
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```
class Main() {  
  void main(){  
    List l = null;  
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      [h1] List temp = new List();  
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3:   temp.next = l;  
     l = temp }  
    while (*) {  
      [h4] T t = new T();  
4:   t.data = l;  
     t.start();  
5:   t.f = ...; }  
    return;  
  }  
}
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class T extends java.lang.Thread {  
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  void run(){  
    while(*){  
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7:   while (*) { m = m.next; }  
8:   synchronized(m){ m.val.f = ...; }  
    return; }  
}
```



# Points-to abstraction

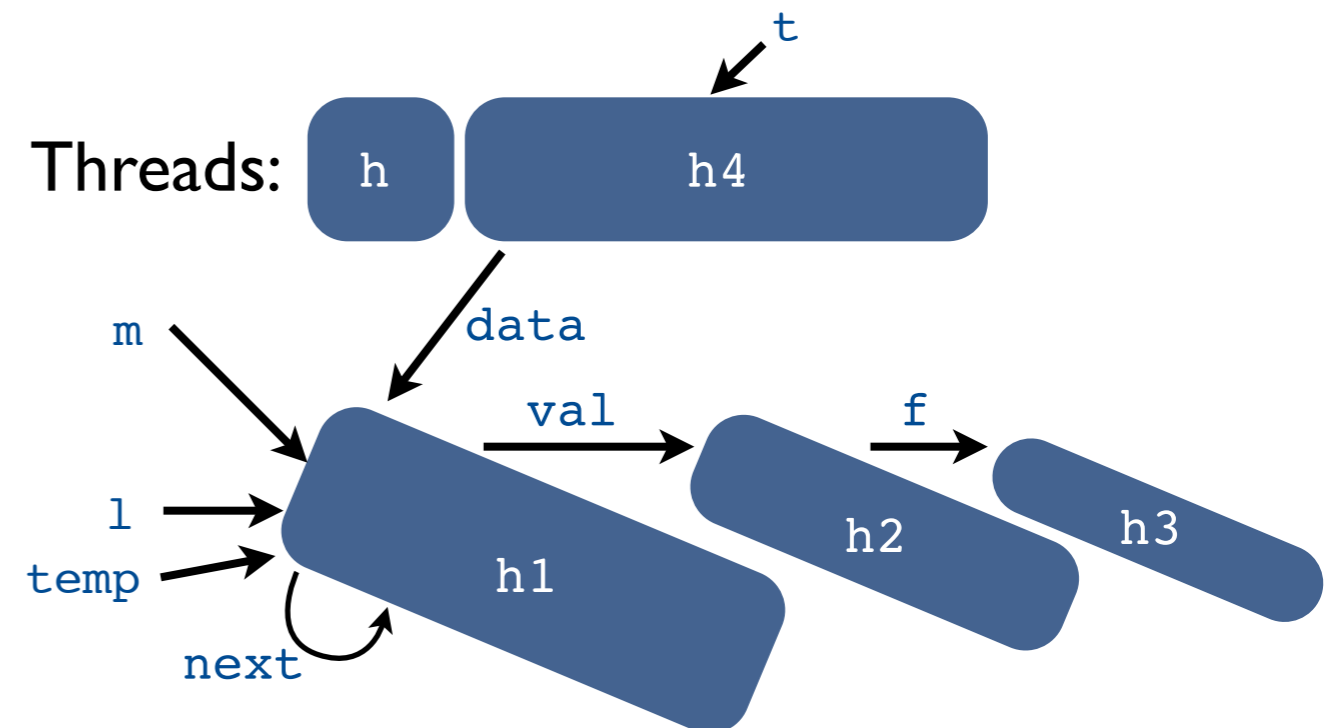
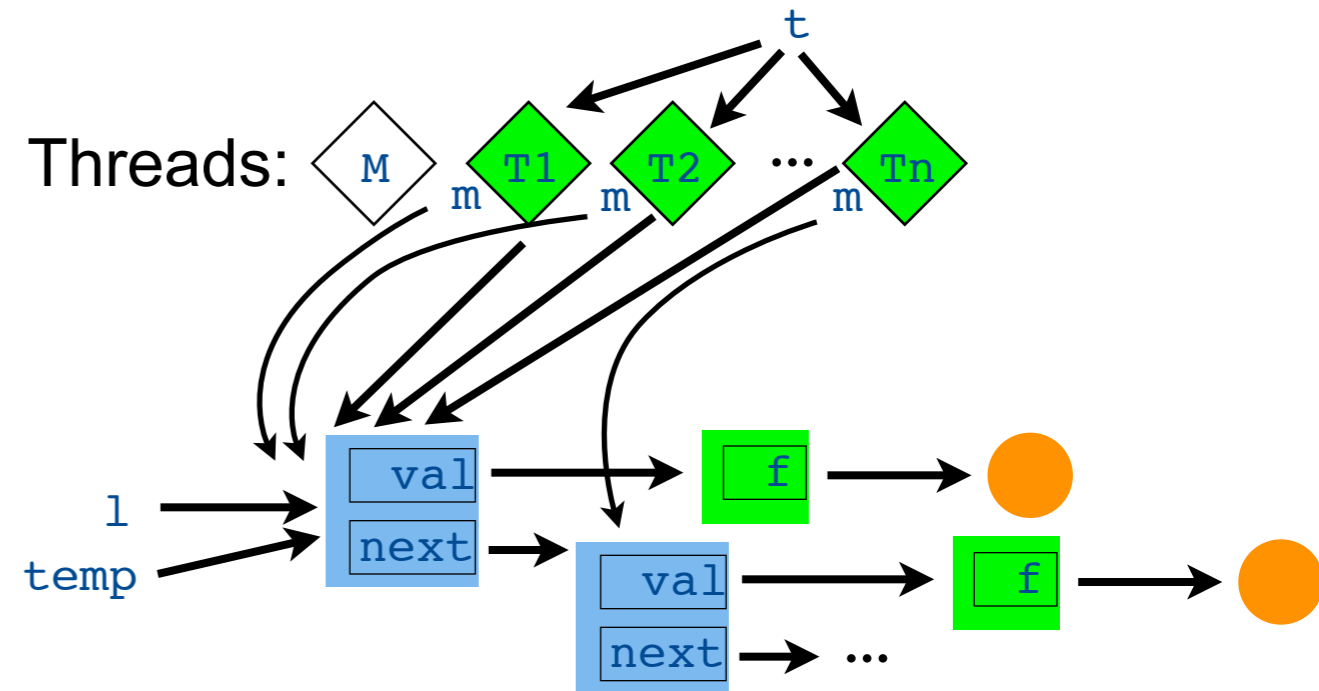
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  void main(){
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    while (*) {
      [h1] List temp = new List();
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3:   temp.next = l;
      l = temp }
    while (*) {
      [h4] T t = new T();
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    return; }
}

```



# Effective Static Data Race Detection for Java

Naik's PhD 2008

Original  
pairs

Reachable  
pairs

Aliasing  
pairs

Escaping  
pairs

Unlocked  
pairs

```
class List{ T val; List next; }
```

```
class Main() {  
  void main(){  
    List l = null;  
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      List temp = new List();  
1:     temp.val = new T();  
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    while (*) {  
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class T extends java.lang.Thread {  
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# Effective Static Data Race Detection for Java

Naik's PhD 2008

Original  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
(4,data,4) (5,f,5) (2,f,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Reachable  
pairs

The first set of potential races  
is based on field safety

Aliasing  
pairs

Escaping  
pairs

Unlocked  
pairs

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
        while (*) {  
            List temp = new List();  
1:         temp.val = new T();  
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Reachable  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,~~f~~,5) (2,~~f~~,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Aliasing  
pairs

The pairs that may be reachable from the program entry and that may concern two distinct threads

Escaping  
pairs

Unlocked  
pairs

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
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            List temp = new List();  
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            l = temp }  
        while (*) {  
            T t = new T();  
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5:         t.f = ...;}  
        return;  
    }  
}
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class T extends java.lang.Thread {  
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# Effective Static Data Race Detection for Java

Naik's PhD 2008

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(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Reachable  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,~~f~~,5) (2,~~f~~,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Aliasing  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
(4,data,4) (5,f,5) (2,~~f~~,5) (5,~~f~~,8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Escaping  
pairs

Using a points-to abstraction  
we compute the pairs that may  
touch the same heap location

Unlocked  
pairs

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
        while (*) {  
            List temp = new List();  
1:         temp.val = new T();  
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class T extends java.lang.Thread {  
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# Effective Static Data Race Detection for Java

Naik's PhD 2008

Original  
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Reachable  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,~~f~~,5) (2,~~f~~,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Aliasing  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
(4,data,4) (5,f,5) (2,~~f~~,5) (5,~~f~~,8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Escaping  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,f,5) (2,~~f~~,5) (5,f, 8) (4,~~data~~,6)  
(3,~~next~~, 7) (1,~~val~~, 8) (2,~~f~~,8) (8,f, 8)

Unlocked  
pairs

The pairs of program points  
where the target location may  
be shared at that points

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
        while (*) {  
            List temp = new List();  
1:         temp.val = new T();  
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        while (*) {  
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```

```
class T extends java.lang.Thread {  
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7:         while (*) { m = m.next; }  
8:         synchronized(m){ m.val.f = ...;}}  
        return;}}
```

# Effective Static Data Race Detection for Java

Naik's PhD 2008

Original  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
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Reachable  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
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Aliasing  
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(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
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(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Escaping  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,f,5) (2,~~f~~,5) (5,f, 8) (4,~~data~~,6)  
(3,~~next~~, 7) (1,~~val~~, 8) (2,~~f~~,8) (8,f, 8)

Unlocked  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
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(3,next, 7) (1,val, 8) (2,f, 8) (8,~~f~~, 8)

Pairs that may not be guarded by the same lock

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
        while (*) {  
            List temp = new List();  
1:         temp.val = new T();  
2:         temp.val.f = new A();  
3:         temp.next = l;  
            l = temp }  
        while (*) {  
            T t = new T();  
4:         t.data = l;  
            t.start();  
5:         t.f = ...;}  
        return;  
    }  
}
```

```
class T extends java.lang.Thread {  
    A f;  
    List data;  
    void run(){  
        while(*){  
6:         List m = this.data;  
7:         while (*) { m = m.next; }  
8:         synchronized(m){ m.val.f = ...;}}    }  
}
```

# Effective Static Data Race Detection for Java

Naik's PhD 2008

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pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
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(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Reachable  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,~~f~~,5) (2,~~f~~,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Aliasing  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
(4,data,4) (5,f,5) (2,~~f~~,5) (5,~~f~~,8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,f, 8)

Escaping  
pairs

(1,~~val~~,1) (1,~~val~~,2) (2,~~f~~,2) (3,~~next~~,3)  
(4,~~data~~,4) (5,f,5) (2,~~f~~,5) (5,f, 8) (4,~~data~~,6)  
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Unlocked  
pairs

(1,val,1) (1,val,2) (2,f,2) (3,next,3)  
(4,data,4) (5,f,5) (2,f,5) (5,f, 8) (4,data,6)  
(3,next, 7) (1,val, 8) (2,f, 8) (8,~~f~~, 8)

```
class List{ T val; List next; }
```

```
class Main() {  
  void main(){  
    List l = null;  
    while (*) {
```

If each original pair has been removed at least one time, the program is data-race free

```
5:     t.f = ...; }  
      return;  
      }  
}
```

```
class T extends java.lang.Thread {  
  A f;  
  List data;  
  void run(){  
    while(*){  
6:     List m = this.data;  
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8:     synchronized(m){ m.val.f = ...;}}  
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# Effective Static Data Race Detection for Java

Naik's PhD 2008

Original  
pairs

(1, ~~val~~, 1) (1, ~~val~~, 2) (2, ~~f~~, 2) (3, ~~next~~, 3)  
(4, ~~data~~, 4) (5, ~~f~~, 5) (2, ~~f~~, 5) (5, ~~f~~, 8) (4, ~~data~~, 6)  
(3, ~~next~~, 7) (1, ~~val~~, 8) (2, ~~f~~, 8) (8, ~~f~~, 8)

Reachable  
pairs

(1, val, 1) (1, val, 2) (2, f, 2) (3, next, 3)  
(4, data, 4) (5, f, 5) (2, f, 5) (5, f, 8) (4, data, 6)  
(3, next, 7) (1, val, 8) (2, f, 8) (8, f, 8)

Aliasing  
pairs

(1, val, 1) (1, val, 2) (2, f, 2) (3, next, 3)  
(4, data, 4) (5, f, 5) (2, f, 5) (5, f, 8) (4, data, 6)  
(3, next, 7) (1, val, 8) (2, f, 8) (8, f, 8)

Escaping  
pairs

(1, val, 1) (1, val, 2) (2, f, 2) (3, next, 3)  
(4, data, 4) (5, f, 5) (2, f, 5) (5, f, 8) (4, data, 6)  
(3, next, 7) (1, val, 8) (2, f, 8) (8, f, 8)

Unlocked  
pairs

(1, val, 1) (1, val, 2) (2, f, 2) (3, next, 3)  
(4, data, 4) (5, f, 5) (2, f, 5) (5, f, 8) (4, data, 6)  
(3, next, 7) (1, val, 8) (2, f, 8) (8, f, 8)

```
class List{ T val; List next; }
```

```
class Main() {  
    void main(){  
        List l = null;  
        while (*) {
```

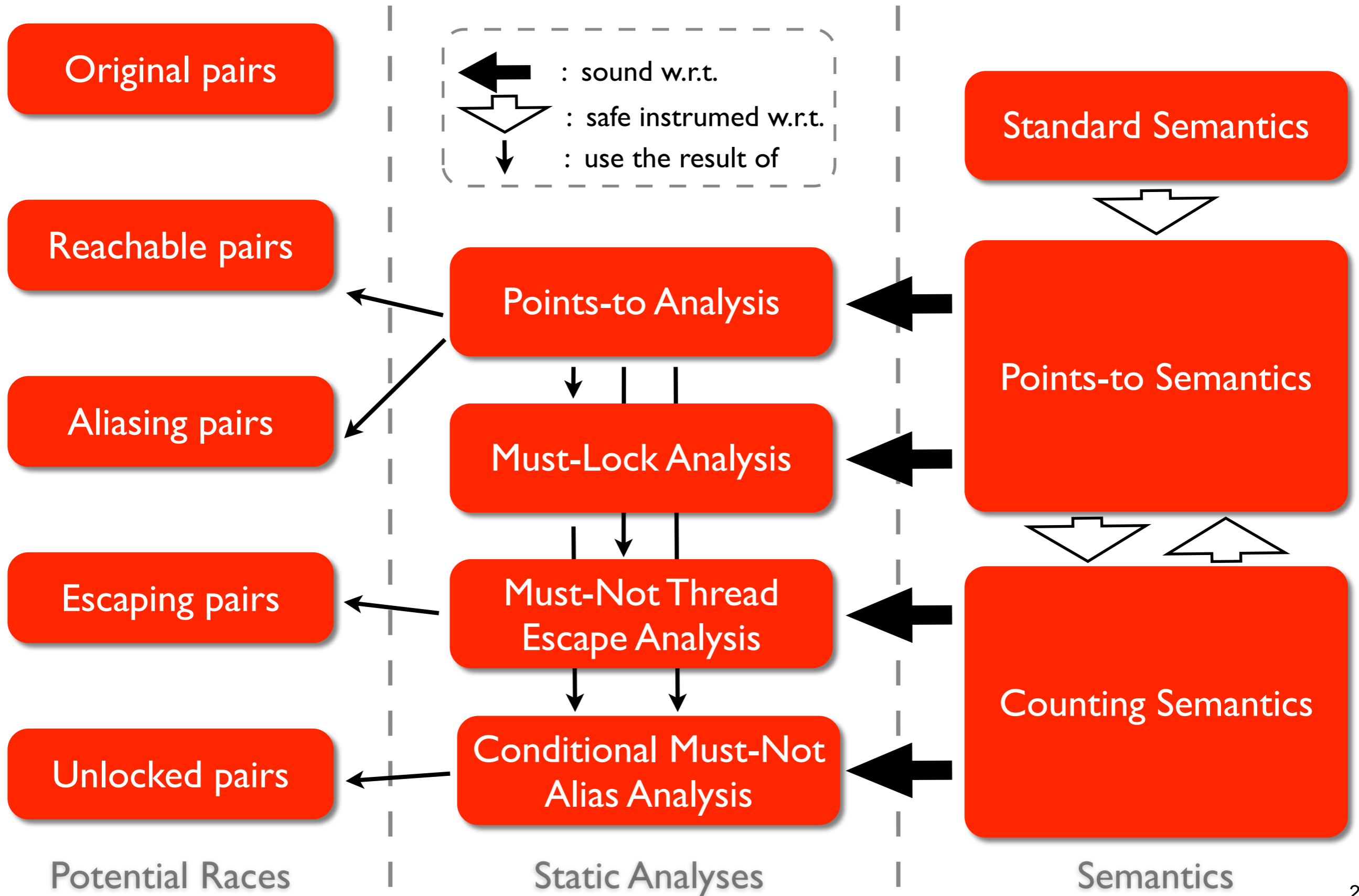
If each original pair has been removed at least one time, the program is data-race free

```
5:         t.f = ...; }  
        return;
```

This program is data-race free!

```
7:         while (*) { m = m.next; }  
8:         synchronized(m) { m.val.f = ...; } }  
        return;}}
```

# Proof Architecture



# Some reading

J. Choi, A. Loginov, and V. Sarkar. Static datarace analysis for multithreaded object-oriented programs. Tech. report, IBM Research Division, 2001.

M. Naik, A. Aiken, and J. Whaley. Effective static race detection for java. PLDI '06

M. Naik and A. Aiken. Conditional must not aliasing for static race detection. POPL'07

M. Naik. Effective static race detection for java. PhD thesis, Stanford university, 2008.

C. Flanagan and S. N. Freund. *FastTrack: efficient and precise dynamic race detection*. Communication of the ACM 2010

H. Boehm and S. V. Adve. *You Don't Know Jack about Shared Variables or Memory Models*. Communication of the ACM 2012

# Conclusions

## Lessons learned

- Mechanized proof can handle more than toy static analyses
  - printing and proofreading these kind of proof would have been very difficult
- Realistic analyses are generally a composition of several sub-analyses
  - mechanized proof make explicit the interactions between them
- Proving correct of a realistic analysis is time consuming
  - about 1.5 man year effort and 15K loc for each proof...

## Methodology

- Each verified analysis increases our knowledge about how to best formalize a static analysis in a proof assistant
  - avoid mechanically proving theorems that are not directly useful for soundness (termination, completeness)
  - design modular proofs with robust interfaces (intermediate semantics, module functors)



# These Lectures

## Lecture 1

Motivations

Examples of verified analysers

## Lecture 2

Coq crash course

## Lecture 3

Verified abstract interpreter for a simple imperative language

## Lecture 4

CompCert

A verified value analysis for CompCert

# A Posteriori Validation

[Extra slides if we have enough time]

# *A Posteriori* Validation

An important tool in our toolbox

We program the *full* static analyzer inside Coq

```
Definition analyzer (p:program) :=  
  ...  
  let x := complex_computation p in  
  ...
```

... or ...

# *A Posteriori* Validation

An important tool in our toolbox

We program the *full* static analyzer inside Coq

```
Definition analyzer (p:program) :=  
  ...  
  let x := complex_computation p in  
  ...
```

... or we program some parts in Coq, other parts in OCaml and use a verified validator

```
Definition analyzer (p:program) :=  
  ...  
  let x := ocaml_external_complex_computation p in  
  match validator x p with  
    | OK  $\Rightarrow$  ...  
    | Error  $\Rightarrow$  abort  
  end.
```

# *A Posteriori* Validation

More formally, instead of proving a function  $f \in A \rightarrow B$  satisfies a spec  $R \subseteq A \times B$

$$\forall a \forall b, (a, f(a)) \in R$$

We define a validator  $f? \in A \times B \rightarrow \{\text{true}, \text{false}\}$  and prove

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# *A Posteriori* Validation

Example: CompCert register allocator

```
Definition regalloc
  (f: function) (live: node → regset) : option (reg → loc) :=

let g := interf_graph f live in

let coloring := graph_coloring f g in

if check_coloring g coloring

then Some (alloc_of_coloring coloring g)

else None.
```

# A *Posteriori* Validation

Example: CompCert register allocator

The function takes a RTL function, the result of a live analysis and returns a location (machine register or in memory)

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Computation of an interference graph between RTL registers: an edge between each registers with overlapping live ranges.

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If the validator fails, the whole function fails

# *A Posteriori* Validation

More advanced pattern

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$$\forall a \forall b, (a, f(a)) \in R$$

We define a validator  $f? \in A \times B \times C \rightarrow \{\text{true}, \text{false}\}$  and prove

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untrusted

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# *A Posteriori* Validation

More advanced example: Farkas proof

Some static analyses or optimisers need to prove unsat. of linear formula

$$\text{UNSAT}(1 \leq x' + 2y \leq 4 \wedge x = x' + 1 \wedge x + 2y < 2)?$$

Just validating a yes/no result would be too hard

# *A Posteriori* Validation

More advanced example: Farkas proof

Some static analyses or optimisers need to prove unsat. of linear formula

$$\text{UNSAT} \left( \begin{array}{cccccc} -1 & +x' & & +2y & \geq & 0 \\ 0 & & & & \geq & 0 \\ -1 & -x' & +x & & = & 0 \\ 2 & & -x & -2y & > & 0 \end{array} \right) ?$$

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$$\text{UNSAT} \left( \begin{array}{cccccc} 1 \times (-1 & +x' & & +2y & \geq & 0) \\ 0 \times (4 & -x' & & -2y & \geq & 0) \\ -1 \times (1 & +x' & -x & & = & 0) \\ 1 \times (2 & & -x & -2y & > & 0) \end{array} \right)$$

Hint computed with  
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⇕

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Hint computed with an external tool (simplex)

$$\text{UNSAT} (0 > 0)?$$

# *A Posteriori* Validation

## Discussion

A validator may fail if

- The external tool contains bugs  
     $\Rightarrow$  we must be able to abort the current computation
- The validator is not *smart* enough (incompleteness)

Some validator are *complete*

- The graph coloring validator is complete wrt any graph coloring algorithm
- The Farkas checker validator is complete if coefficients are rational (incomplete on integers)
- Other example: SSA generation  
In Gilles Barthe, Delphine Demange, and David Pichardie. *A formally verified SSA-based middle-end*, ESOP 2012, we provide a complete validator for SSA generation based on dominance frontier computation