# **Iodine Fast Dynamic Taint Tracking Using Rollback-free Optimistic Hybrid Analysis**

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#### **Contents**

Introduction

Background

• Iodine

Evaluation

Conclusion

## Introduction

## Dynamic information-flow tracking (DIFT)

- DIFT enforces a security or privacy policy
  - Also called taint-tracking
- It tags **source** data as tainted, **propagates** taints through data and control flow, and checks if tainted data reaches **sinks**

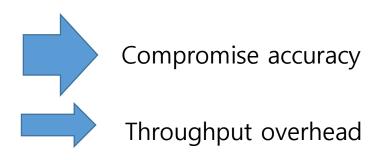
```
c = sensitive\_source()
a = b+c
network\_send(a)
assert(!t(a))
assert(!t(a))
```

 DIFT can help detect security attacks or prevent sensitive information from leaking through untrusted channels

## **Practicality**

- Every instruction has to be monitored to propagate taints to the destination operand based on the source operands' taint
  - Prohibitive performance overhead
  - Slowdown up to 1-2 orders of magnitude

- How to reduce this cost
  - Reducing tainted sources
  - Coarsening the granularity of objects
  - Parallelizing
  - •



## Optimistic hybrid analysis (OHA)

- Execution paths that violate an information-flow policy are almost either rare or impossible
  - DIFT fundamentally do more work than necessary
- OHA uses both static analysis and dynamic analysis to elide likely unnecessary
   DIFT monitors
- A static analysis can identify these instructions and elide DIFT monitors for that
- The soundness problem: the elided instructions may be necessary monitors
  - → the program execution is replayed from the **beginning**

#### **lodine**

 A novel OHA approach that enable efficient and sound DIFT for live execution

- Iodine eliminates the need for rollback and enables forward recovery
- Any monitor elided during a program execution has to be proven to be unnecessary to ensure soundness → safe elision

## Background

## Conservative hybrid analysis

- A pure DIFT instruments all instructions to propagate taints
- Information-flow leaks are rare
  - Not propagating taints or not reaching any sink
- The hybrid analysis optimizes its dynamic taint analysis
  - Static analysis can be used to remove unnecessary monitors
- There are two ways in the hybrid analysis
  - Forward taint analysis
  - Backward taint analysis

## Forward taint analysis

- It determines if the source operands of an instruction may be tainted
- If none of the source operands may be tainted, then its track monitor is pruned

```
sink: printf()
source: s
 main (...) {
                             main (...)
1 x = c + 3;
                               \mathbf{x} = \mathbf{c} + 3;
                                                   ← Neither source operands are tainted
   t(x) = t(c);
                                                      x will not be tainted
                               y = s;
   t(y) = t(s);
                               t(y) = t(s);
3 if (p < 0) {
                               if (p < 0) {
     z = c * y;
                                  z = c * v;
     t(z) = t(c) \mid t(y);
                                  t(z) = t(c) | t(y);
5 out = z;
                                out = z;
                                t(out) = t(z);
   t(out) = t(z);
   assert(!t(z));
                                assert(!t(z));
6 printf(z); }
                                printf(z); }
```

(a) Full dynamic analysis (b) Conservative hybrid analysis

## **Backward taint analysis**

 It determines whether a destination operand of an instruction may reach a sink

• If not, track monitor for that instruction is elided (even if it can be

tainted)

```
source: s sink: printf()
 main (...) {
                            main (...) {
                              x = c + 3:
1 x = c + 3;
   t(x) = t(c);
                               y = s;
   t(y) = t(s);
                              t(y) = t(s);
                                                    ← Cannot leverage this property soundly
                              if (p < 0) {
3 if (p < 0) {
                                 z = c * v;
     z = c * y;
     t(z) = t(c) \mid t(y);
                                 t(z) = t(c) \mid t(y);
5 out = z;
                               out = z;
                               t(out) = t(z);
   t(out) = t(z);
   assert(!t(z));
                               assert(!t(z));
6 printf(z); }
                               printf(z); }
```

(a) Full dynamic analysis (b) Conservative hybrid analysis

## Optimistic hybrid analysis (OHA)

- Conservative hybrid analysis is still limited
  - Many infeasible program states is included
  - Most executions cover only a small subset of common execution states
- OHA consider the states that will be realized in the dynamic executions
- An OHA profiler observes representative executions to gather likely invariants
  - e.g., unreachable code, callee sets, unrealized call contexts
  - These are mostly true, but are hard to prove statically
- The likely invariants are used as predicates for forward & backward analysis
  - Resulting in a <u>predicated</u> static taint analysis

## **Example of OHA**

The executions only have "p>=0"

```
sink: printf()
                            source: s
                                 main (...) {
                                    x = c + 3;
                                    y = s;
                                    t(y) = t(s);
                                    if (p < 0) {
→ "z=c*y" is never executed
                                      z = c * y;
                                      t(z) = t(c) | t(y);
                                    out = z;
\rightarrow The variable z
                                    t(out) = t(z);
does not tainted due to y
                                    assert(!t(z));
                                    printf(z); }
```

(b) Conservative hybrid analysis

nitor: never reach sink

forward monitor: source operand never tainted

## Problem: rollback recovery in OHA

- When a likely invariant fails, the predicated static analysis is rendered as unsound
- When it fails, the program execution is replayed from the beginning using the conservative hybrid analysis

```
main (...) {
    x = c + 3;
    y = s;
    t(y) = t(s);
    if (p < 0) {
        z = c * y;
        t(z) = t(c) | t(y);
    }
    out = z;
    t(out) = t(z);
    assert(!t(z));
    printf(z); }

sink: printf()

(b) Conservative hybrid analysis

(c) Optimistic hybrid analysis</pre>
```

A rollback to the beginning compromises availability of the system

source: s

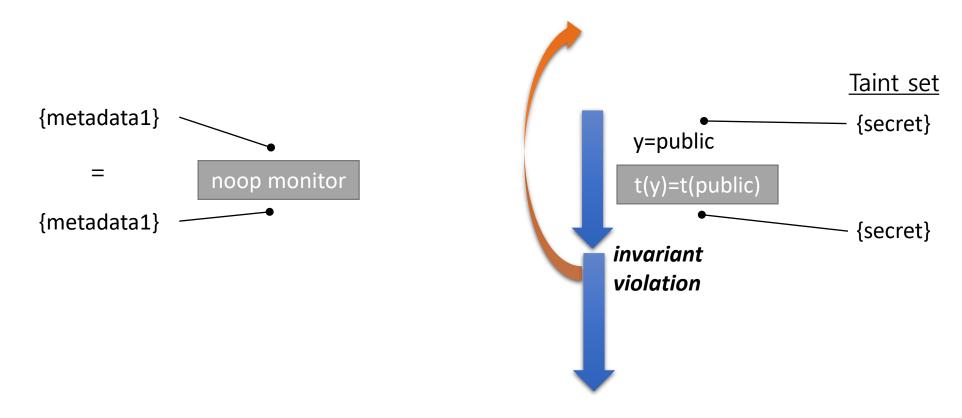
## Iodine

#### Safe elisions

- Iodine is a rollback-free OHA using safe elision
  - The need for rollback on invariant failure is eliminated
- Rollbacks are cased by the dependence between the current monitor being elided and potential future invariant failures
- Iodine elides a monitor when it can prove that an invariant violation would not affect any preceding elisions of that monitor

### Noop monitor elisions

A noop monitor is one that does not change the analysis metadata state



• Elisions of noop monitors are safe elisions

## Noop monitor elisions

We assume R is unreacable

```
main (...) {
    x = c + 3;
    NOT noop monitor

    y = s;
    t(y) = t(s);
    if (p < 0) {
        z = c * y;
        t(z) = t(c) | t(y);
    }

    out = z;

    t(out) = t(z);
    assert(!t(z));

    printf(z)noop monitor

    main (...) {
        x = c + 3;
        v = c;
        if (p < 0) {
              inv_check();
              z = c * y;
              cut = z;
              cut = z;

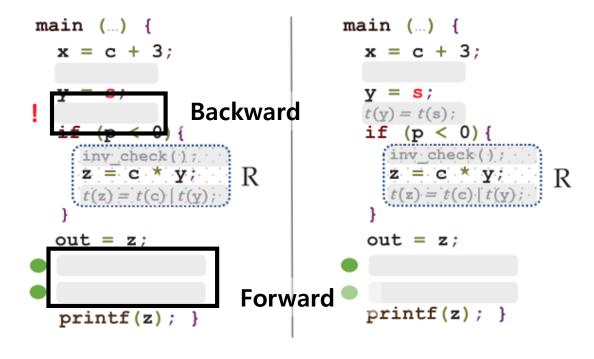
              printf(z);
        }
```

- (b) Conservative hybrid analysis
- (c) Optimistic hybrid analysis
- (d) Rollback-free OHA

source: s sink: printf()

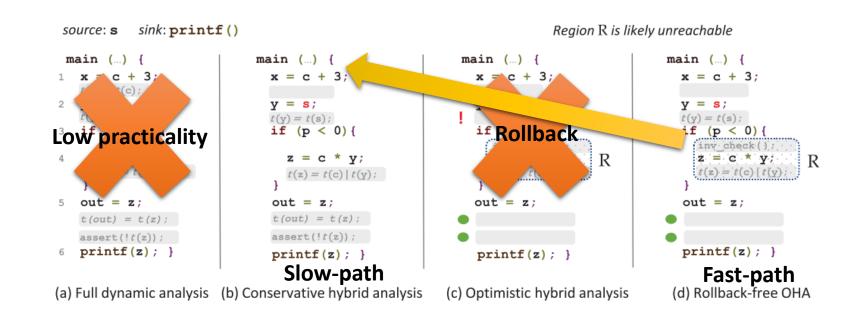
### Noop monitor elisions

- Predicated forward optimizations are safe
  - All elided monitors are noop monitors
- Predicated backward optimizations may not be safe



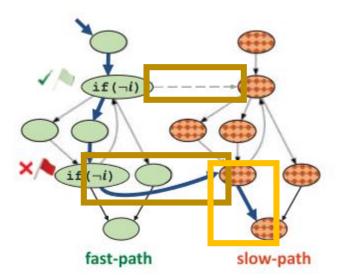
### Rollback-Free Optimistic Hybrid Taint Analysis

- Iodine uses predicated forward analysis and conservative backward analysis
- How to treat invariant violation
  - It instruments a conditional branch for every invariant check
  - Optimized dynamic analysis (fast-path) is executed until an invariant fails
  - The invariant check switches the control to a conservatively optimized analysis (slow-path)



## Forward recovery mechanism

- Each function implements both the fast-path and the slow-path code
  - The control flow graph for a function is replicated
- A conditional jump to the slow-path is inserted to each invariant check
  - When invariant fails, the execution is switched
- All functions in the call stack must switch to the slow-path upon a return from the slow-path domain
  - After every call site, a conditional switch switches to the slow-path



## **Evaluation**

## **Experimental setup**

- Implementation: LLVM compiler infrastructure supporting C language
  - LLVM's Data Flow Sanitizer as instrumentation backend
- Environment: a single core of an Intel Xeon E5-2620 processor with 16GB RAM
- Benchmark suit.
  - Postfix mail server test generators
  - nginx/thttpd: serving webpages
  - redis: database server
  - vim: text processing
  - gzip: (de-)compressing files
- Profiling executions to gather likely invariants
  - Postfix stress tests
  - ngnix, thttpd serving pydoc3 documentation and loading webpages
  - redis benchmarking application and performing geo-search
  - vim challenge solutions
  - gzip with SPEC's bzip2 and sphinx reference inputs
- → A profile set of 400 executions, and a performance test set of 100 executions

#### Iodine framework overhead

- Invariant check overhead
  - Invariant checks have nearly no effect on runtime, incurring only 2% of overall execution time

- Invariant violation overhead
  - During some-to-all analysis, only sendmail, redis and vim violates an invariant in 3, 2, and 5 (out of 100) executions respectively
  - The amortized overhead of the slow path analysis resulting from the invariant violation is less than 0.5%

## **IFT Security policies**

- Security policy from Dytan (related work) and Google desktop's privacy policy
  - Email integrity and privacy: receiver addresses are entirely determined by user input and message dates are only determined by the time syscall, etc.
  - Overwrite attacks on web server: taints all network inputs, and asserts that tainted values are not used as function pointers, etc.

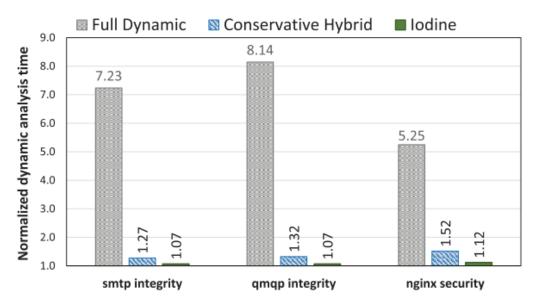


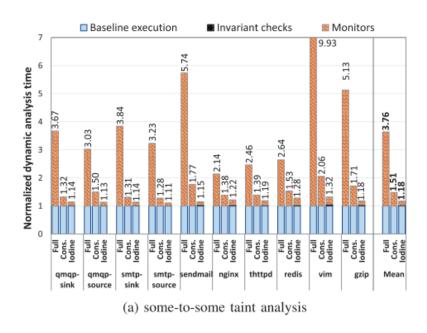
Fig. 5: Dynamic information-flow tracking applications

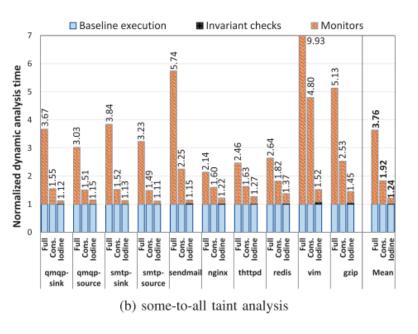
The effectiveness of Iodine using real taint policies

→ 4.4x reduction in runtime overhead

## Generic information-flow policies

- Two different variants of taint analysis is implemented to evaluate the effectiveness of Iodine in a forward-only analysis vs. a forward-backward analysis
  - Some-to-some: propagates taint from a randomly sampled fraction of the taint sources to the set of all sink instructions → both forward and backward analyses are used
  - Some-to-all: treats all instructions as potential sinks and propagates taints from the sampled taint sources → only forward analysis is used





→ lodine significantly reduces the runtime overhead

## Conclusion

#### Conclusions

- Optimistic hybrid analysis (OHA) to optimize dynamic information flow tracking (DIFT) suffers from rollback recovery problem
- Iodine presents a novel approach by eliminating the need for rollbacks
- Iodine restricts predicated static analysis optimizations to noop safe elision
- Thereby, it improves the precision of static analysis and reduces runtime overhead