

Hybrid Information Flow monitoring against Web tracking

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Panopticlick

How Unique – and Trackable – Is Your Browser?

[Eckersley'10]

Your browser fingerprint **appears to be unique** among the 2,419,678 tested so far.

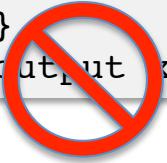
Currently, we estimate that your browser has a fingerprint that conveys **at least 21.21 bits of identifying information**.

- Information needed to **uniquely identify a browser**
 - n – number of connected devices: **5 000 000 000**
 - $\log_2 n$ – number of bits for a unique id: **33 bits**
- **Idea: distinguish users by browser fingerprints:**
 - HTTP headers
 - Browser and OS features: language, **plugins, fonts, screen, ...**

The most identifying features (via JavaScript and Flash)

Some scripts are useful

```
var x = 0;  
if (name == "FireFox") {  
    x = 1;  
}  
output x;
```

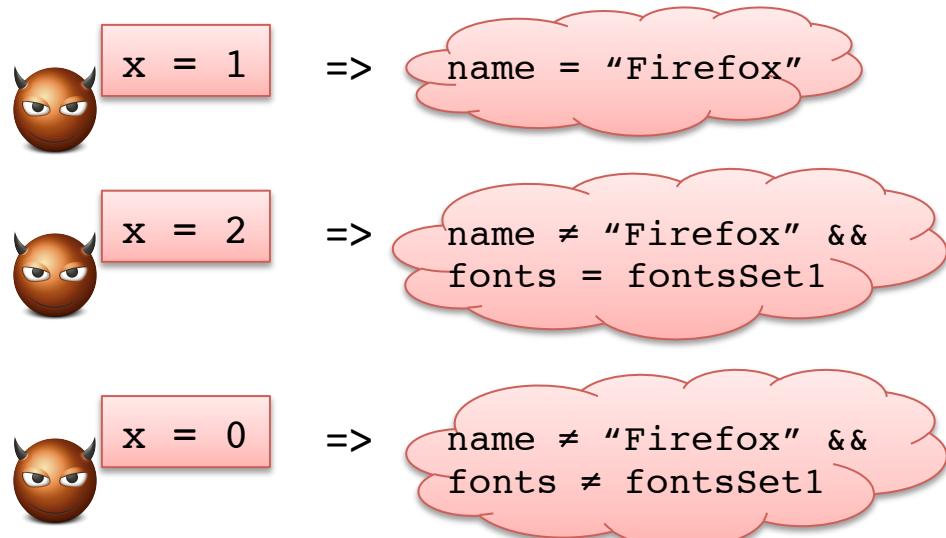


name: browser name
output x: request containing x sent

Non-interference is too restrictive:
x depends on name

What does tracker learn?

```
var x = 0;  
if (name == "Firefox") {  
    x = 1;  
}  
else {  
    if (fonts == fontsSet1) {  
        x = 2;  
    }  
}  
output x;
```



Depending on user's browser, **different executions** of this script **leak different quantity** of information!

Quantification of leakage

- **Self-information, or “surprisal”**
 - “amount of information about the identity” [Eckersley’10]
 - = beliefs for deterministic programs [Clarkson, Myers, Schneider’07]

$$\text{Leak}(A) = -\log_2 P(A)$$

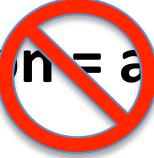
```
var x = 0;
if (name == "FireFox") {
    x = 1;
}
output x;
```

Popularity of “FireFox” is 21%

$$\text{Leak}(\text{name} = \text{"FireFox"}) = -\log_2 0.21 = 2.25 \text{ bits}$$

$$\text{Leak}(\text{name} \neq \text{"FireFox"}) = -\log_2 0.79 = 0.34 \text{ bits}$$

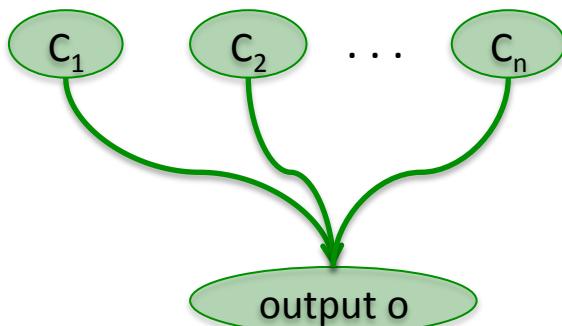
- **Entropy-based definition = average leakage for all browsers!**


$$H(\text{name}) - H(\text{name} / x) = 0.74 \text{ bits}$$

Knowledge of tracker: configurations

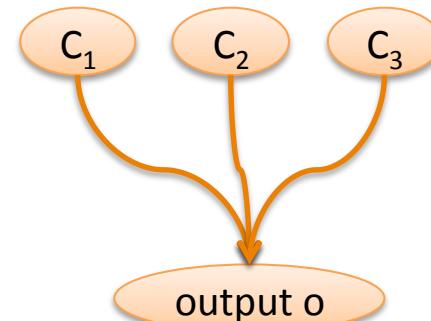
- Browser configuration $C : \text{Features} \rightarrow \text{Val}$
- $\text{Features} = \{\text{name}, \text{fonts}, \dots\}$ and $C(\text{name}) = \text{"FireFox"}$
- Leakage by **self-information**: $\text{Leak}(A) = -\log_2 P(A)$

Noninterference
All configurations



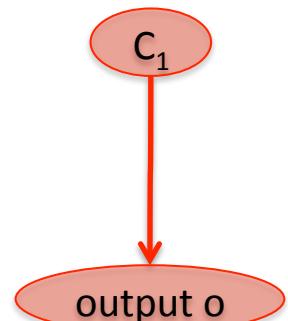
$$-\log_2(P(C_1) + \dots + P(C_n)) = -\log_2 1 = 0 \text{ bits}$$

Partial leakage
Some configurations



$$-\log_2(P(C_1) + P(C_2) + P(C_3)) \text{ bits}$$

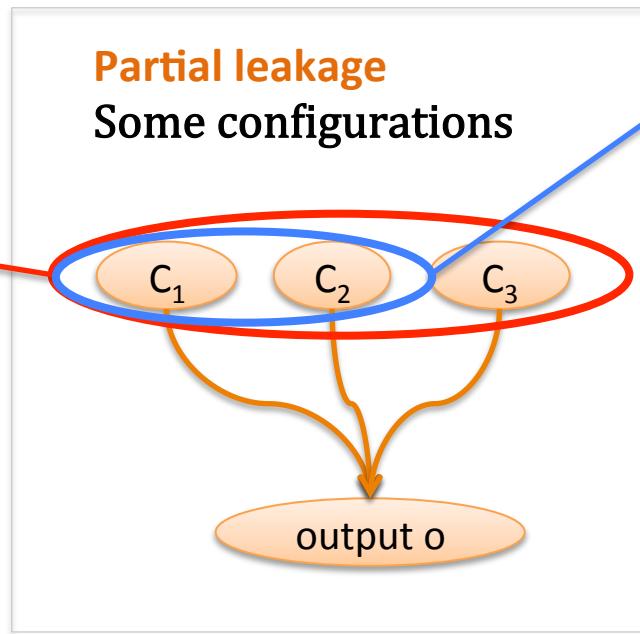
Complete leakage
One configuration



$$-\log_2 P(C_1) \text{ bits}$$

Knowledge of tracker: configurations

Actual knowledge of tracker
is a set of equivalent
configurations $Eq(P, C)$



We over-approximate
knowledge by a set of
configurations

Smaller set induces a bigger leakage:
 $S_1 \subseteq S_2 \Rightarrow Leak(S_1) \geq Leak(S_2)$

Knowledge of tracker: formula

- Set of configurations represented by a formula

$$B ::= tt \mid ff \mid f = v \mid f \neq v \mid B \wedge B \mid B \vee B$$

f : browser feature
 v : value

Noninterference
All configurations

$$\{C_1, C_2, \dots, C_n\}$$

tt

Partial leakage
Some configurations

$$\{C_i \mid C_i(\text{name}) = \text{"FireFox"} \wedge C_i(\text{fonts}) \neq \text{fontsSet}\}$$

$\text{name} = \text{"FireFox"} \wedge$
 $\text{fonts} \neq \text{fontsSet}$

Stronger formula induces a bigger leakage:

$$(a_1 \Rightarrow a_2) \Rightarrow \text{Leak}(a_1) \geq \text{Leak}(a_2)$$

Dynamic knowledge propagation

- Dynamic labeling $K: \text{Vars} \rightarrow \text{Formula}$
 - for browser features: $K(\text{name}): \text{name} = \text{"FireFox"}$



```
x = name;  $K(x): \text{name} = \text{"FireFox"}$ 
```



```
x = 0;  $K(x): tt$ 
if (name == "FireFox") {
    x = 1;  $K(x): \text{name} = \text{"FireFox"}$ 
}
output x;
```

Dynamic knowledge propagation



```
x = 1; K(x): tt  
y = 1; K(y): tt  
  
if (name == "FireFox") {  
    x = 0; K(x): name = "FireFox"  
}  
output y; K(y): name = "FireFox"
```

Crucial for soundness:
y could be updated in the other branch

Resembles
No-sensitive upgrade

Dynamic analysis **is not very precise!**

Let's statically analyze non-executed branches!

Hybrid monitor + syntactic checks

[Le Guernic et al.'07]
[Russo and Sabelfeld'10]

```
x = 1; y = 1; z = 1; K(x) = K(y) = K(z) = tt
if (name == "FireFox") {
    x = 0; K(x): name = "FireFox"
}
else {
    y = 1; y could have been modified! ← Static analysis
}
K(y): name = "FireFox"
output z; K(z) = tt
output y; K(y): name = "FireFox"
```

We can gain precision by tracking the values!

HM + constant propagation and dependency

- Dynamic analysis: $env: Var \rightarrow Val$
- Static analysis: $env: Var \rightarrow Val \cup \{T\}$



```
var x = 1; env(x) = 1
var y = fonts; K(y): fonts = fontsSet

if (name == "FireFox") {
    x = 1; env(x) = 1 K'(x): tt
}
else {
    if (y != fontsSet) {
        x = 2;
    }
} env(x) = 1
output x;
```

Combination of knowledge in $K(x)$

Static

$env(x) = 1$

Dynamic

$env(x) = 1$

$(name = "FireFox" \Rightarrow K'(x)) \wedge$
 $(name \neq "FireFox" \Rightarrow K'(x))$

HM + constant propagation and dependency

- Dependency analysis $D: \text{Var} \rightarrow 2^{\text{Var}}$



```
var x = 1; env(x) = 1
var y = fonts; K(y): fonts = fontsSet2

if (name == "FireFox") {
    x = 1; env(x) = 1 K'(x): tt
}
else {
    if (y != fontsSet) {
        x = 2;
    } env(x) = 1
}
output x;
```

$$(name = "FireFox" \Rightarrow K'(x)) \wedge (name \neq "FireFox" \Rightarrow K'(x))$$

$$(name = "FireFox" \Rightarrow tt) \wedge (name \neq "FireFox" \Rightarrow \bigwedge_{y \in D(x)} K(y))$$

$$name \neq "FireFox" \Rightarrow fonts = fontsSet$$

$$name = "FireFox" \vee fonts = fontsSet$$

HM + constant propagation and dependency

One rule of hybrid monitor:

Static analysis uses the same environment!

$$[\text{IF THEN}] \frac{\llbracket B \rrbracket_C^\rho \quad (S_1, (\rho, K)) \Downarrow_C s' \quad (S_2, \rho) \Downarrow^\sharp s^\sharp}{(\text{if } B \text{ then } S_1 \text{ else } S_2, (\rho, K)) \Downarrow_C \llbracket B, K, s', s^\sharp \rrbracket_\rho}$$

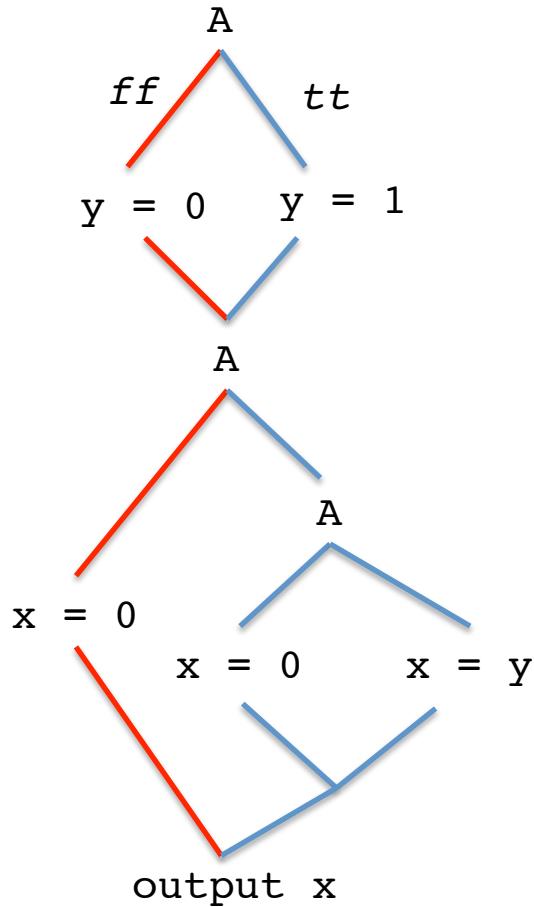
$\llbracket B, K, (\rho', K'), (\rho^\sharp, D) \rrbracket_\rho = (\rho', K'')$, where

$$K''(x) = \begin{cases} \left(\neg \delta(B)_\rho^K \Rightarrow \bigwedge_{y \in D(x)} K(y) \right) \wedge \left(\neg \bar{\delta}(B)_\rho^K \Rightarrow K'(x) \right) & \text{if } \rho^\sharp(x) = \rho'(x) \\ \delta(B)_\rho^K \wedge K'(x) & \text{otherwise} \end{cases}$$

Resembles weakest precondition:

$$wp(\text{if } B \text{ then } S_1 \text{ else } S_2) = \bigwedge \left(\begin{array}{c c c} \neg B & \Rightarrow & wp(S_2) \\ B & \Rightarrow & wp(S_1) \end{array} \right)$$

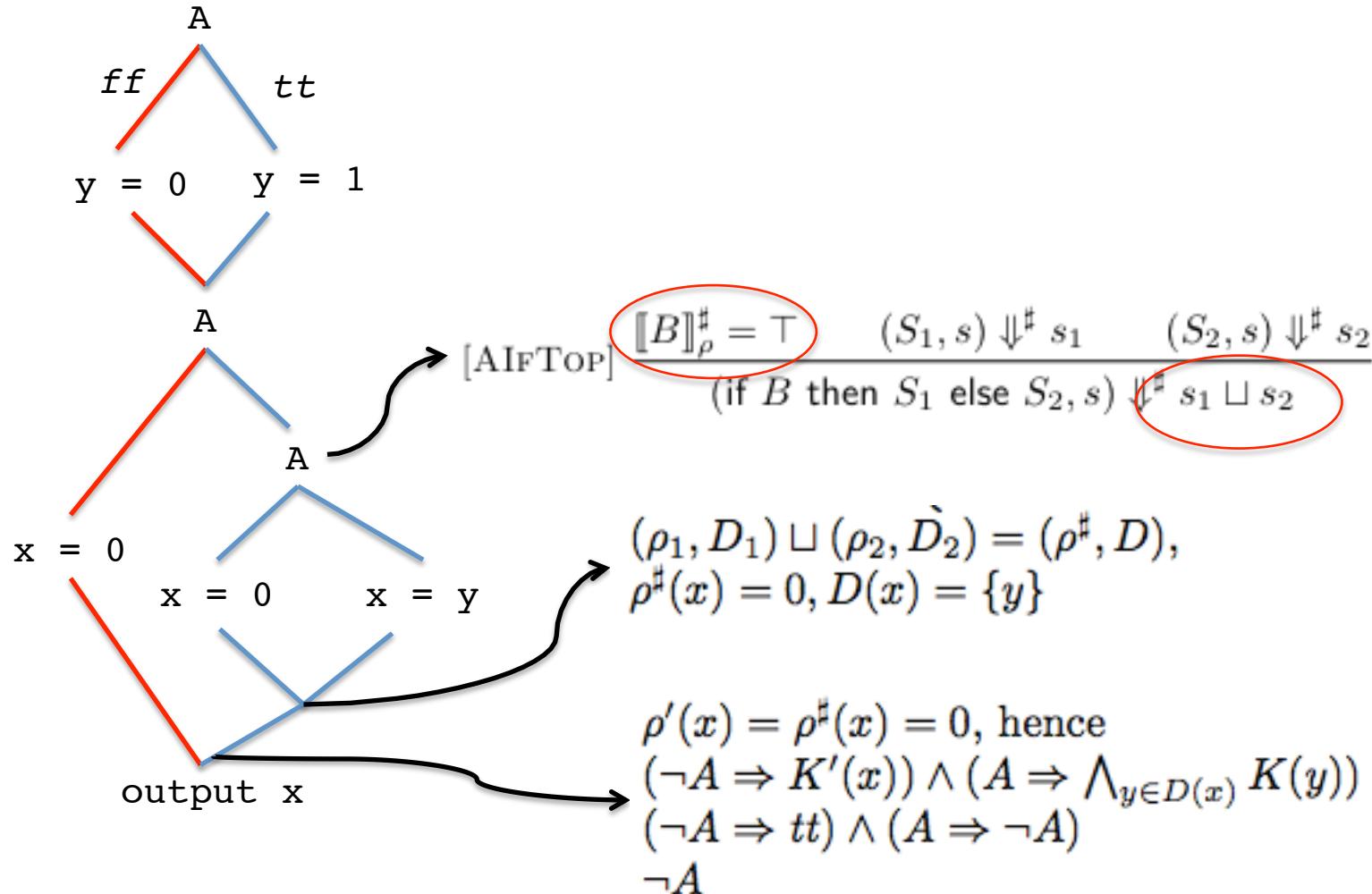
Example



$A === (\text{name} == \text{"FireFox"})$

```
var x = 0;  
var y = 0;  
  
if (A) { y = 1; }  
else { y = 0; }  
if (A) {  
    if (A) { x = 0; }  
    else { x = y; }  
}  
else { x = 0; }  
output x;
```

Example



Soundness and Precision

Actual knowledge of tracker is a set of equivalent configurations $Eq(P,C)$

Definition (Soundness)

A hybrid monitor is **sound** if for all variables x , $K(x)$ over-approximates the knowledge of the tracker

$$Models(K(x)) \subseteq Eq(P,C)$$

Theorem (Soundness)

A **sound** static analysis induces a **sound** hybrid monitor.

All the theorems are proven in Coq: <http://www.irisa.fr/celtique/ext/QIF/>

Soundness and Precision

Definition (Precision)

A hybrid monitor A is **more precise than** a hybrid monitor B, if for all variables x:

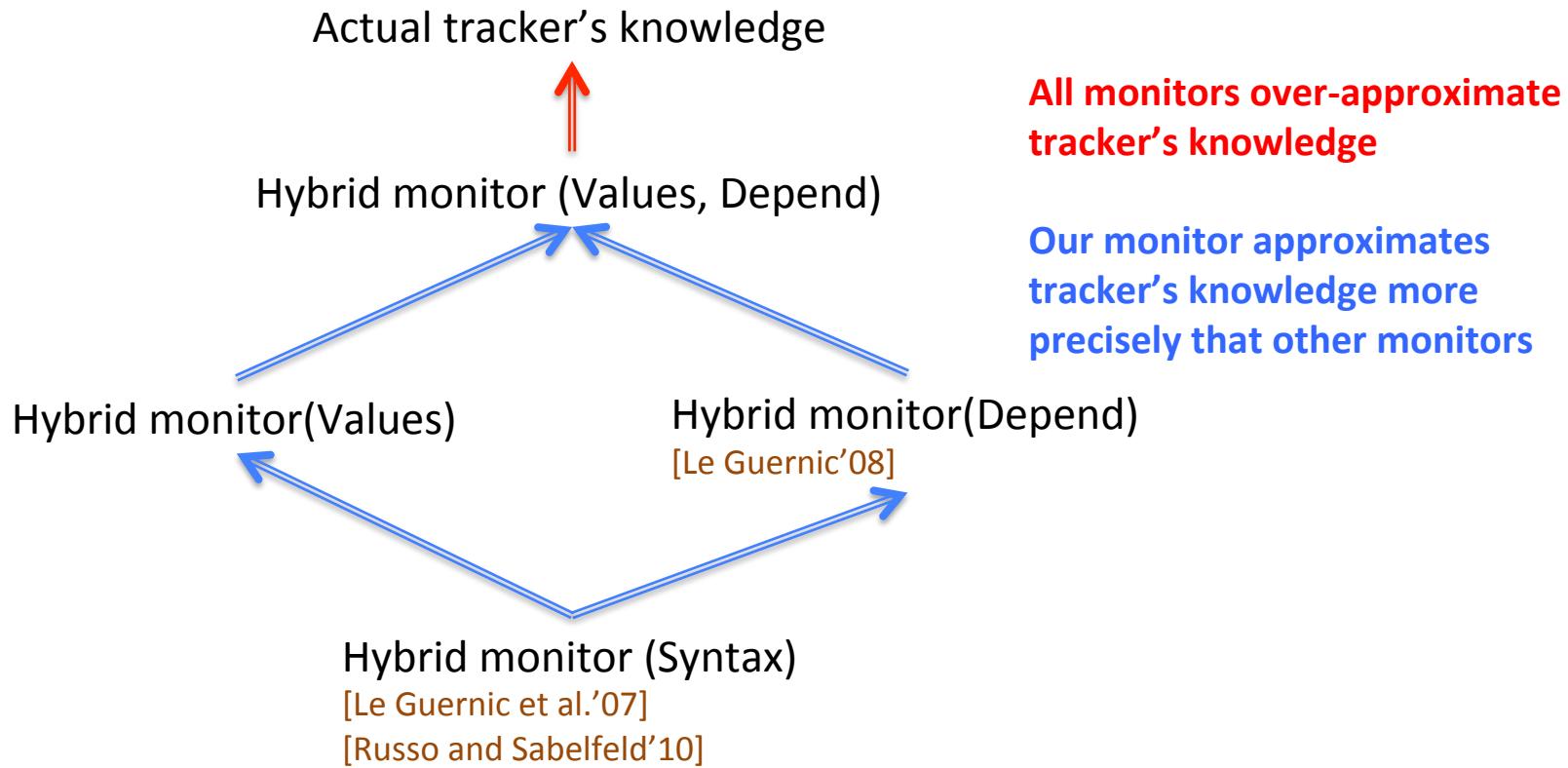
$$\text{Models}(K_B(x)) \subseteq \text{Models}(K_A(x))$$

Theorem (Precision)

A **more precise** static analysis induces a **more precise** monitor.

All the theorems are proven in Coq: <http://www.irisa.fr/celtique/ext/QIF/>

Hierarchy of hybrid monitors parameterized by static analysis



All the relations are proven in Coq: <http://www.irisa.fr/celtique/ext/QIF/>

Our results

- Hybrid information flow monitoring
 - Labeling with knowledge
 - Knowledge => quantitative leakage
 - Parameterization by static analysis
- Soundness and precision
 - Requirements for static analysis
 - Easy comparison of hybrid monitors
- Hierarchy of hybrid monitors ordered by precision
 - Constant propagation + dependency analysis => more precise monitor