

# Static information flow analysis

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(slides by David Pichardie, Delphine Demange, Thomas Jensen)

# Secure information flow

**Overall goal** : prevent secret (confidential, private, . . . ) data to leak to an attacker.

**Technique** : follow the flow of secret data during execution

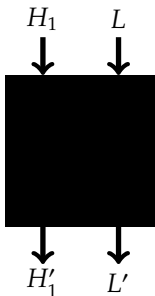
- ▶ **Statically** : analyse (prove) the security of the program before execution.
- ▶ **Dynamically** : guarantee the security of an execution, using a security monitor.

**In this lecture** :

- ▶ what does it mean for a program to **leak** a secret?
- ▶ different forms of leakage,
- ▶ a type system for proving information flow security,
- ▶ how to **de-classify** information securely.

# Non-interference

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

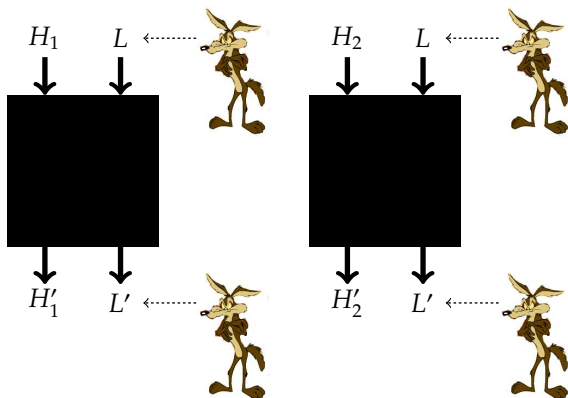


High (H) = confidential

Low (L) = public

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# Secure programs

The set of variables is partitioned into two disjoint sets :

- ▶  $\mathbb{V}_H$  : high (or secret) variables
- ▶  $\mathbb{V}_L$  : low (or public) variables

Intuitively<sup>1</sup>, a program is *secure* (or *non interfering*) if the **final** values of **low** variables do not depend on the **initial** values of the **high** variables.

**Examples** : are these programs secure or not?

- 1 `h := 1`
- 2 `l := h`
- 3 `if (h1>0) then {l := 1} else {l := 2}`
- 4 `while (h) do { l := l+1 }; l := 0`

We distinguish between **direct** and **indirect** flows

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1. This notion will be defined formally when presenting the semantics of the language.

# A lattice of security levels

Information flow can be defined for arbitrary *lattices of security levels*. We consider here only two security levels (low and high).



We write  $\sqsubseteq$  for the partial order and  $\sqcup$  for the least upper bound.

There is a **flow of information** from  $x$  to  $y$  if the value of the variable  $y$  depends on the value of the variable  $x$ .

If  $x$  is of level  $k_x$  and  $y$  of level  $k_y$ , then the flow from  $x$  to  $y$  is

- ▶ secure if  $k_x \sqsubseteq k_y$
- ▶ illegal if  $k_x \not\sqsubseteq k_y$

# Program syntax

WHILE language with mixed arithmetic and boolean expressions.

<b>Expr</b> ::=	$n$	$n \in \mathbb{Z}$
	$x$	$x \in \mathbb{V}_H \uplus \mathbb{V}_L$
	<b>Expr</b> $o$ <b>Expr</b>	$o \in \{+, -, \times, \dots\}$
	<b>Expr</b> $c$ <b>Expr</b>	$c \in \{=, \neq, <, \leq, \dots\}$
	<b>Expr</b> $b$ <b>Expr</b>	$b \in \{\text{and, or}\}$
		$bop \in o \cup c \cup b$
<b>Stm</b> ::=	$x :=$ <b>Expr</b>	
	<b>if</b> <b>Expr</b> <b>then</b> <b>Stm</b> <b>else</b> <b>Stm</b>	
	<b>while</b> <b>Expr</b> <b>do</b> <b>Stm</b>	
	<b>Stm</b> ; <b>Stm</b>	

The set of variables is partitioned into two disjoint sets :

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# A simple information flow type system (1/3)

We will present a simple information flow type system<sup>2</sup> and prove it enforces a semantic non-interference property on well-typed programs.

Typing judgment for expressions :  $e \in \mathbf{Expr}$ ,  $\tau \in \{L, H\}$

$$\vdash e : \tau$$

Meaning : the expression  $e$  **depends only** on variables of level  $\tau$  or lower.

Typing rules : ( $\tau_x$  stands for the  $\ell$  such that  $x \in \mathbb{V}_\ell$ )

$$\begin{array}{c} \text{CONST} \frac{}{\vdash n : L} \quad \text{VAR} \frac{}{\vdash x : \tau_x} \quad \text{BINOP} \frac{\vdash e_1 : \tau \quad \vdash e_2 : \tau}{\vdash e_1 \text{ *bop* } e_2 : \tau} \\ \\ \text{EXP-SUBTYP} \frac{\vdash e : \tau_1 \quad \tau_1 \sqsubseteq \tau_2}{\vdash e : \tau_2} \end{array}$$

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



# Example

Assuming  $h \in \mathbb{V}_H$ , a type derivation for  $\vdash h + 1 : H$

$$\text{BINOP} \frac{\text{VAR} \frac{h \in \mathbb{V}_H}{\vdash h : H} \quad \text{EXP-SUBTYP} \frac{\text{CONST} \frac{}{\vdash 1 : L} \quad L \sqsubseteq H}{\vdash 1 : H}}{\vdash h + 1 : H}$$

# A simple information flow type system (2/3)

Typing judgment for statements :  $S \in \mathbf{Stm}$ ,  $\tau_{pc} \in \{L, H\}$

$$\tau_{pc} \vdash S$$

Intuition :

- ▶  $\tau_{pc}$ , the program-counter label, tracks the dependencies of the current program point (to forbid indirect flows).
- ▶ the variables **modified by** statement  $S$  are of level  $\tau_{pc}$  or higher.

**Ensures** : well-typed programs have no illicit flows.

Typing rules : ( $\tau_x = \ell$  means  $x \in \mathbb{V}_\ell$ )

$$\text{ASSIGN} \frac{\vdash e : \tau \quad \tau \sqcup \tau_{pc} \sqsubseteq \tau_x}{\tau_{pc} \vdash x := e} \qquad \text{SEQ} \frac{\tau_{pc} \vdash S_1 \quad \tau_{pc} \vdash S_2}{\tau_{pc} \vdash S_1 ; S_2}$$

$$\text{IF} \frac{\vdash e : \tau \quad \tau \sqcup \tau_{pc} \vdash S_i \quad i = 1, 2}{\tau_{pc} \vdash \mathbf{if } e \mathbf{ then } S_1 \mathbf{ else } S_2} \qquad \text{WHILE} \frac{\vdash e : \tau \quad \tau \sqcup \tau_{pc} \vdash S}{\tau_{pc} \vdash \mathbf{while } e \mathbf{ do } S}$$

# A simple information flow type system (3/3)

## Sub-typing rule :

$$\text{STM-SUBTYP} \frac{H \vdash S}{L \vdash S}$$



The subtyping relation on statements is *contravariant*!

**Intuition** : typing  $S$  under a high context guarantees that all assignments are to variables of high level, so OK (but not precise) to say that it assigns to variables of high **or** low levels.

**More intuition** : typing  $S$  under a high context is more difficult (because it limits direct and indirect flows), so  $S$  is shown to be "more secure".

# Exercise

## Exercise (Typing derivations)

Assuming  $l \in \mathbb{W}_L$  and  $h \in \mathbb{W}_H$ , try to type the following statements (give a type derivation, if possible) :

- ▶ `if (l) then h := l else l := 0`
- ▶ `if (h) then h := l else l := 0`
- ▶ `if (h) then l := 0 else l := 0`

# Type soundness

We want to prove that the type system is indeed ensuring non-interference.

To do so :

- ▶ define the semantics of the language
- ▶ define the semantic property we want to prove (non-interferent program)
- ▶ prove that all well-typed programs satisfy the property

# A natural semantics

**State** = **Var**  $\rightarrow$   $\mathbb{Z}$

$\llbracket \cdot \rrbracket \in$  **Expr**  $\rightarrow$  **State**  $\rightarrow$   $\mathbb{Z}$  (semantics of expressions)

$(\cdot, \cdot) \Downarrow \cdot \subseteq$  (**Stm**  $\times$  **State**)  $\times$  **State** (semantics of statements)

$$\llbracket n \rrbracket s = \mathcal{N} \llbracket n \rrbracket$$

$$\llbracket x \rrbracket s = s(x)$$

$$\llbracket e_1 + e_2 \rrbracket s = \llbracket e_1 \rrbracket s + \llbracket e_2 \rrbracket s$$

...

$$\frac{}{(x := e, s) \Downarrow s[x \mapsto \llbracket e \rrbracket s]} \qquad \frac{(S_1, s) \Downarrow s' \quad (S_2, s') \Downarrow s''}{(S_1; S_2, s) \Downarrow s''}$$

$$\frac{(S_1, s) \Downarrow s' \quad \llbracket e \rrbracket s = 1}{(\text{if } e \text{ then } S_1 \text{ else } S_2, s) \Downarrow s'} \qquad \frac{(S_2, s) \Downarrow s' \quad \llbracket e \rrbracket s = 0}{(\text{if } e \text{ then } S_1 \text{ else } S_2, s) \Downarrow s'}$$

$$\frac{(S, s) \Downarrow s' \quad (\text{while } e \text{ do } S, s') \Downarrow s'' \quad \llbracket e \rrbracket s = 1}{(\text{while } e \text{ do } S, s) \Downarrow s''} \qquad \frac{\llbracket e \rrbracket s = 0}{(\text{while } e \text{ do } S, s) \Downarrow s}$$

# The observational power of an attacker

Here, we will consider that the attacker only sees low variables before and after executions.

We model his observational power with an *equivalence* relation between states.

$$\sim \subseteq \mathbf{State} \times \mathbf{State}$$

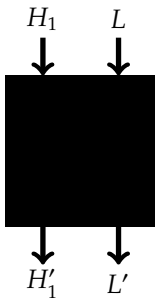
$$s_1 \sim s_2 \text{ iff } \forall x \in \mathbb{V}_L, s_1(x) = s_2(x)$$

**Intuition** : the attacker cannot distinguish between equivalent states.

**NB** : This relation can be extended to an arbitrary security lattice.

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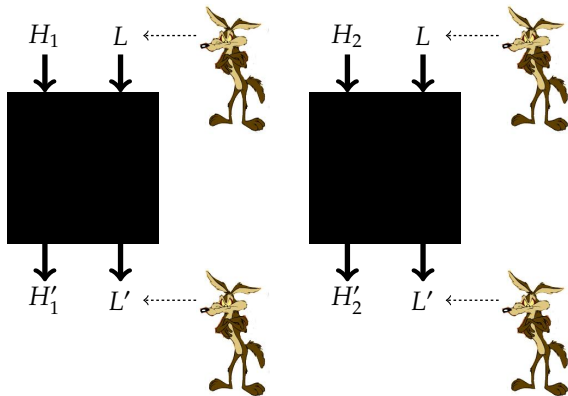
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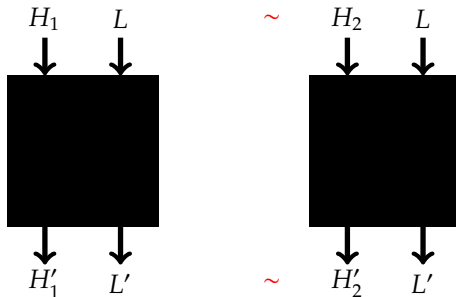


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$$\forall s_1, s_2, s'_1, s'_2, \quad s_1 \sim s_2 \wedge (P, s_1) \Downarrow s'_1 \wedge (P, s_2) \Downarrow s'_2 \implies s'_1 \sim s'_2$$

# Type soundness

## Definition (Non-interference)

A statement  $S$  is said *non interferent* iff for all  $s_1, s_2$  such that  $s_1 \sim s_2$ ,

$$\left. \begin{array}{l} (S, s_1) \Downarrow s'_1 \\ (S, s_2) \Downarrow s'_2 \end{array} \right\} \text{implies } s'_1 \sim s'_2$$

## Theorem (Type soundness)

Every typable statement (i.e. such that  $\exists \tau_{pc}, \tau_{pc} \vdash S$ ) is non-interferent.

## Exercise

Prove this theorem.

# Type soundness proof : step 1

We need a new set of typing rules.

$$\begin{array}{c}
 \text{CONST}' \frac{}{\vdash_s n : \tau} \quad \text{VAR}' \frac{\tau_x \sqsubseteq \tau'}{\vdash_s x : \tau'} \quad \text{BINOP}' \frac{\vdash_s e_1 : \tau \quad \vdash_s e_2 : \tau}{\vdash_s e_1 \text{ *bop* } e_2 : \tau} \\
 \\
 \text{ASSIGN}' \frac{\vdash_s e : \tau_x \quad \tau' \sqsubseteq \tau_x}{\tau' \vdash_s x := e} \quad \text{SEQ}' \frac{\tau \vdash_s S_1 \quad \tau \vdash_s S_2}{\tau \vdash_s S_1 ; S_2} \\
 \\
 \text{IF}' \frac{\vdash_s e : \tau \quad \tau \vdash_s S_1 \quad \tau \vdash_s S_2 \quad \tau' \sqsubseteq \tau}{\tau' \vdash_s \text{ *if* } e \text{ *then* } S_1 \text{ *else* } S_2} \\
 \\
 \text{WHILE}' \frac{\vdash_s e : \tau \quad \tau \vdash_s S \quad \tau' \sqsubseteq \tau}{\tau' \vdash_s \text{ *while* } e \text{ *do* } S}
 \end{array}$$

This type system is *syntax-directed* : at most one rule can be used for each program construct (expression or statement).

# Type soundness proof : step 1

## Lemma (Sub-typing property)

For all  $e, \tau, \tau'$ ,  $\vdash_S e : \tau$  and  $\tau \sqsubseteq \tau'$  implies  $\vdash_S e : \tau'$ .

For all  $S, \tau, \tau'$ ,  $\tau' \vdash_S S$  and  $\tau \sqsubseteq \tau'$  implies  $\tau \vdash_S S$ .

**Proof.** By induction on the typing judgment.

The new system is equivalent to the previous one.

## Lemma

For all  $e, \tau$ ,  $\vdash e : \tau$  implies  $\vdash_S e : \tau$ .

For all  $S, \tau$ ,  $\tau \vdash S$  implies  $\tau \vdash_S S$ .

**Proof.** By induction on the typing judgment.

## Lemma

For all  $e, \tau$ ,  $\vdash_S e : \tau$  implies  $\vdash e : \tau$ .

For all  $S, \tau$ ,  $\tau \vdash_S S$  implies  $\tau \vdash S$ .

**Proof.** By induction on the typing judgment.

## Type soundness proof : step 2

### Lemma (Low expressions)

For all  $e \in \mathbf{Expr}$ , if  $\vdash_s e : L$ , then for all  $s_1, s_2 \in \mathbf{State}$ ,  $s_1 \sim s_2$  implies  $\llbracket e \rrbracket_{s_1} = \llbracket e \rrbracket_{s_2}$ .

**Proof.** By induction on type derivation for  $e$ .

### Lemma (Confinement of high statements)

For all  $S \in \mathbf{Stm}$ , and  $s, s' \in \mathbf{State}$ , if  $(S, s) \Downarrow s'$  and  $H \vdash_s S$ , then  $s \sim s'$ .

**Proof.** By induction on the judgment  $(S, s) \Downarrow s'$ .

### Theorem (Type soundness)

For all  $S \in \mathbf{Stm}$ ,  $s_1, s_2, s'_1, s'_2 \in \mathbf{State}$ ,  $\tau_{pc} \in \{L, H\}$ , if  $s_1 \sim s_2$ ,  $(S, s_1) \Downarrow s'_1$ ,  $(S, s_2) \Downarrow s'_2$  and  $\tau_{pc} \vdash_s S$  then  $s'_1 \sim s'_2$ .

**Proof.** By induction on the judgment  $(S, s_1) \Downarrow s'_1$ . Be careful with the **while** case.

## A few remarks on the type system

- ▶ The attacker may have additional observation power (timing, power consumption)
- ▶ Type checking is computable but non-interference is not

### Exercise (Type system incompleteness)

Give an example of non-interferent program that is not typable.

### Exercise (IFC Challenges)

Solve as many IFC challenges as you can on :

<http://ifc-challenge.appspot.com/>

For each of the challenges :

- ▶ give a valid type derivation for your leaky program
- ▶ indicate whether (and if so, why) the type system is not restrictive enough
- ▶ elaborate on a possible solution to disallow your attack

## Variations on the theme of observation



# Observational power of attacker

We have ignored some information channels :

- ▶ timing channels

```
if h>0 then skip else {<huge, non-interfering computation> }
```

measuring the run-time of this program may reveal secret informations.  
See lecture on side-channels analysis later in the course.

- ▶ termination channels

```
while h>0 do skip
```

- ▶ power consumption (differential power attacks)

## Covert channels from power consumption

A bit more challenging : power consumption per processor clock cycle

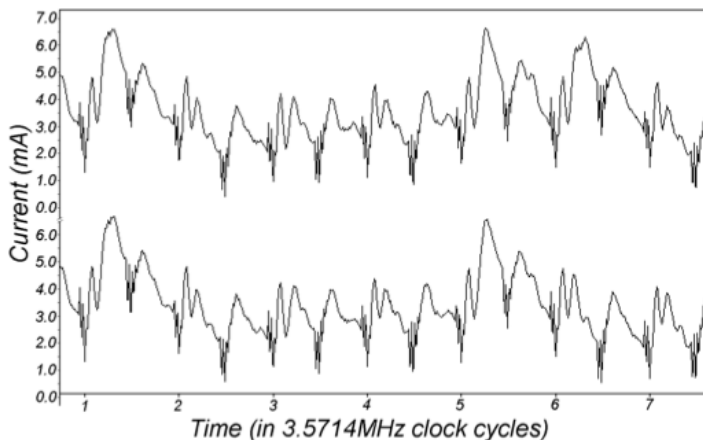


Figure – Paul C. Kocher, Joshua Jaffe, and Benjamin Jun. Differential Power Analysis. CRYPTO '99.

# JavaScript channels

In JavaScript, records are extensible.  
Furthermore, the presence of fields can be tested.

```
myway:InfoFlow demange$ node  
> var o = {}  
> o.secret === undefined  
true  
> o.secret = 1  
> o.secret === undefined  
false
```

The **structure** of data can be used to transmit information!

## Scheduler-based channels

Consider two threads

T1: `h := 0; l := h`

and

T2: `h := secret`

Separately, each thread is safe (T1 erases `h`).

Executed concurrently, they may leak the secret.

Implicit flows can also arise :

T1: `(if h > 0 then sleep(100) else skip); l := 1`

and

T2: `sleep(50); l := 0`

Most schedulers will leak `h` into `l`

Making executions **atomic** can remedy this — but is expensive.

# Declassification

# Giving (some) information away

Code should not leak sensitive information.

Non-interference is sometimes too strong a property.

Some applications **intentionally** leak some confidential information :

- ▶ password checking always reveals some secret
- ▶ statistics
- ▶ ...

Need to give away *some* information.

Need for controlled information release or **declassification**

# Declassification

Distinguish several **dimensions**<sup>3</sup> of declassification :

- ▶ **what** data can be declassified? (*e.g.*, the average of a salary data base)
- ▶ **who** can declassify? (and who can influence the decisions of declassification).
- ▶ **when** can data be declassified (*e.g.*, release highest bid in an auction with secret bids, non-interference “until”)?
- ▶ **where** can data be declassified (*e.g.*, after passing a down-grader)?

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3. See Sabelfeld and Sands : *Dimensions of Declassification*, J. Comp Security.

# Controlling information release

Declassification might compromise confidentiality.

Ensure that secrets are not leaked via release mechanisms.

Information release violates non-interference!

⇒ we cannot rely on previous type system to ensure security.

What security guarantees for programs with declassification?



# An operator for declassification

We introduce a binary operator `declassify(exp, lvl)` that takes as arguments

- ▶ an expression *exp*
- ▶ a security level *lvl* such as high, low, ...

**Intention** : the information computed by *exp* can be declassified to the level *lvl*.

For example, one would like the type system to accept<sup>4</sup>

```
avg := declassify((h_1 + ... + h_n)/n, low)
```

Rejected by non-interference.

**But how to ensure that we are not declassifying more than intended?**

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4.  $h_i$  are secrets,  $avg, n$  are low variables

## Delimited release

**Principle :** Only release declassified data and no further information

**Intuition :** Expression  $exp$  can be declassified in statement  $S$  if making the value of  $exp$  visible does not reveal information about secret input.

**Formally :** All environments that are indistinguishable through  $exp$  are indistinguishable through  $S$ .

**Definition :**  $exp$  is safe to declassify in  $S$  if

$$s_1 \sim s_2 \text{ and } \llbracket exp \rrbracket s_1 = \llbracket exp \rrbracket s_2 \text{ and } (S, s_1) \Downarrow s'_1 \text{ and } (S, s_2) \Downarrow s'_2$$

implies

$$s'_1 \sim s'_2$$

### Exercise (Security property)

Are non-interferent programs secure wrt. delimited release? If yes, prove it. If not, give a counter example.

# Examples

## Exercise

Are the following programs obeying delimited release?

- ▶ `avg := declassify((h_1 + ... + h_n)/n, low)`
- ▶ `tmp := h_1; h_1 := h_2; ... h_n := tmp;`  
`avg := declassify((h_1 + ... + h_n)/n, low)`
- ▶ `h_2:=h_1;...; h_n:=h_1;`  
`avg:=declassify((h_1+...+h_n)/n,low);`

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Example 1 : accepted. Why?

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- ▶ `tmp := h_1; h_1 := h_2; ... h_n := tmp;`  
`avg := declassify((h_1 + ... + h_n)/n, low)`
- ▶ `h_2:=h_1;...; h_n:=h_1;`  
`avg:=declassify((h_1+...+h_n)/n,low);`

Example 1 : accepted. Why?

Example 2 : accepted. Why?

# Examples

## Exercise

Are the following programs obeying delimited release?

- ▶ `avg := declassify((h_1 + ... + h_n)/n, low)`
- ▶ `tmp := h_1; h_1 := h_2; ... h_n := tmp;`  
`avg := declassify((h_1 + ... + h_n)/n, low)`
- ▶ `h_2:=h_1;...; h_n:=h_1;`  
`avg:=declassify((h_1+...+h_n)/n,low);`

Example 1 : accepted. Why?

Example 2 : accepted. Why?

Example 3 : rejected. Why?

To see this, set

$$s_1 = [h_1 = 2, h_2 = 4, avg = 0] \text{ and } s_2 = [h_1 = 4, h_2 = 2, avg = 0]$$

Then `declassify((h_1 + ... + h_n)/n, low)` has value 3 in  $s_1$  and  $s_2$  but leads to final states where observable variable `avg` has different values.

# Type system for declassification

**Idea** : prevent new information from flowing into variables used in declassifying expressions

**Intuition** : `exp` should not contain high variables other than `h` in

`h := exp ; ... ; declassify(h,low);`

## Type system

- ▶  $\vdash e : l, D$  where  $l$  is a security level and  $D$  the variables used in declassified expressions in  $e$ .
- ▶  $\tau_{pc} \vdash S : (U, D)$  where  $U$  are variables being updated in  $S$  and  $D$  variables used in declassification operations in  $S$ .
- ▶ declassified variables may not be updated prior to declassification

# Type system for declassification

## Typing rules (a selection)

$$\text{EXP-DECLASS} \frac{\vdash e : l', D}{\vdash \mathbf{declassify}(e, l) : l, \text{Vars}(e)}$$

$$\text{CMD-ASG} \frac{\vdash e : l', D \quad l' \cup \tau_{pc} \sqsubseteq \tau_x}{\tau_{pc} \vdash x := e : \{x\}, D}$$

$$\text{CMD-SEQ} \frac{\tau_{pc} \vdash S_1 : U_1, D_1 \quad \tau_{pc} \vdash S_2 : U_2, D_2 \quad U_1 \cap D_2 = \emptyset}{\tau_{pc} \vdash S_1; S_2 : U_1 \cup U_2, D_1 \cup D_2}$$



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