

# **51.505 – Foundations of Cybersecurity**

## **Week 3 - Information Flow**

Created by **Martin Ochoa** (2017)  
Modified by **Jianying Zhou** (2018)

Last updated: 28 Sept 2018

# Recap

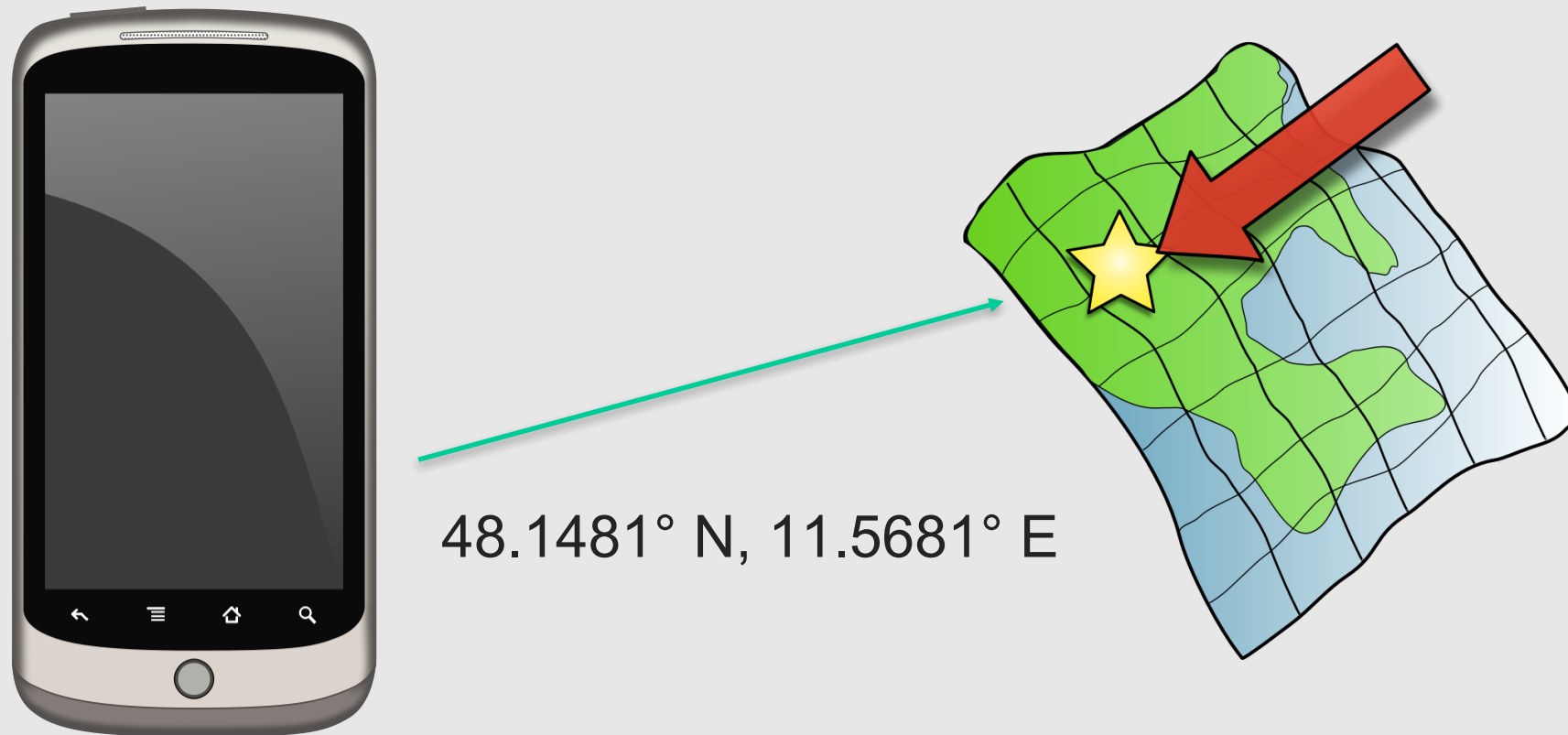
- Questions on last week's exercises?

# Confidentiality & Integrity: Non-interference

- Non-interference: an alternative formulation of security policy models.
  - ✓ A strict separation of subjects requires that all channels, not merely those designed to transmit information, must be closed.
- A precise definition attempt by Goguen/Meseguer (1982):
  - ✓ Elegantly capture both confidentiality and integrity notions.
- Thoroughly studied in the literature from different perspectives, playing a role in recent attacks (side-channels).

J. Goguen and J. Meseguer. "Security Policies and Security Models". IEEE S&P 1982.

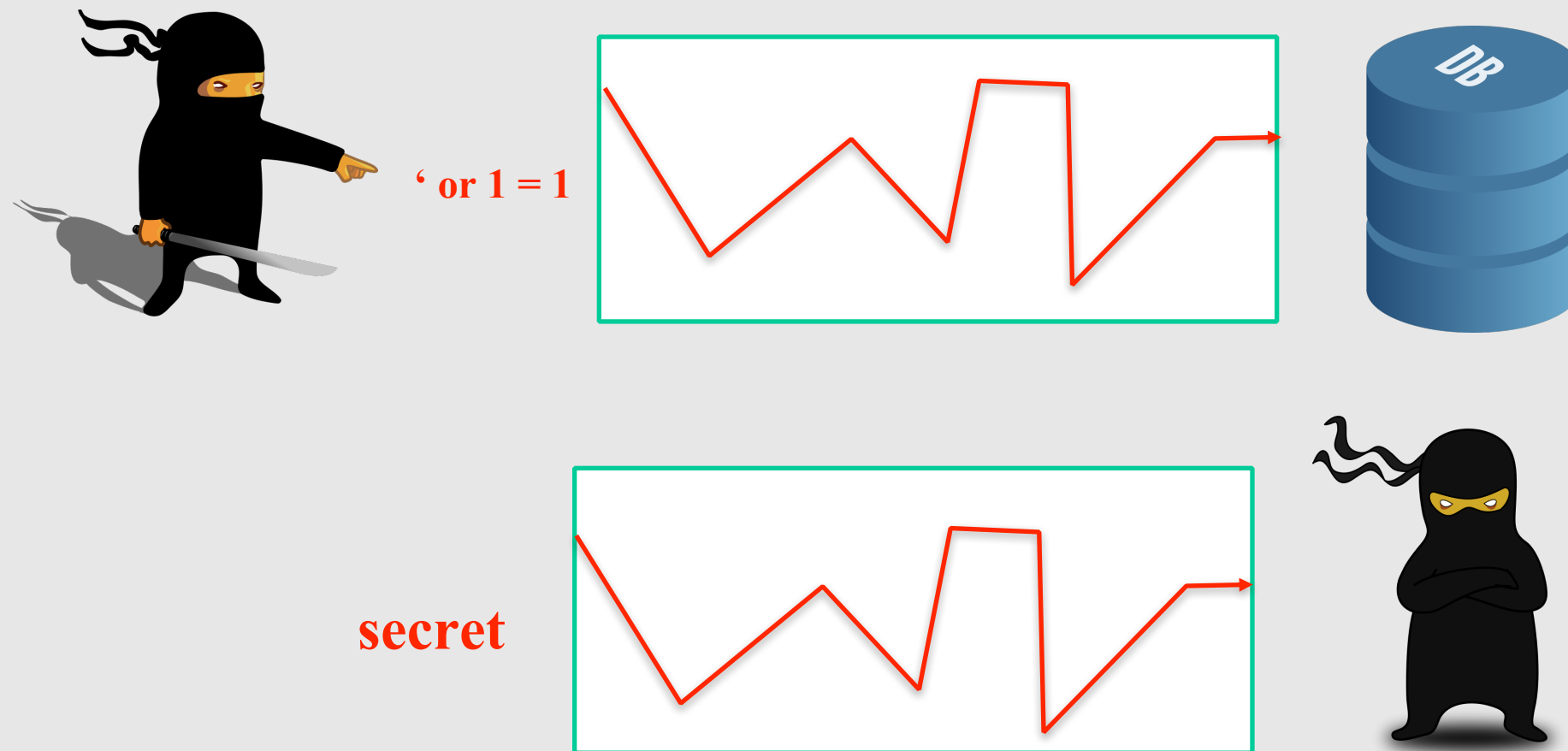
# Information Flow



- For instance, a Map app wants your coordinates for providing a service.
- Therefore the app needs access to the current location.
- Are the coordinates transmitted to untrusted third parties afterward?

# Practical Interpretation of Unwanted Flows

- Exploiting a vulnerability that alters data is an integrity violation.



- An attack that leaks information violates confidentiality.

# Interference

- Single system with 2 users:
  - ✓ Each has own virtual machine.
  - ✓ Holly at system high, Lara at system low so they *cannot communicate directly*.
- CPU shared between VMs based on load:
  - ✓ Form a covert channel through which Holly, Lara can communicate.

# Interference

- Think of it as something used in "indirect" communication.
  - ✓ Covert channel: Holly interferes with the CPU utilization, and Lara detects it.
  - ✓ Example: at a fixed interval, if Holly runs his program, "transmitting" a 1-bit to Lara; If not, "transmitting" a 0-bit to Lara.
  - ✓ Violating \*-property.

# Model

- System as state machine:
  - ✓ Subjects  $S = \{ s_i \}$
  - ✓ States  $\Sigma = \{ \sigma_i \}$
  - ✓ Outputs  $O = \{ o_i \}$
  - ✓ Commands  $Z = \{ z_i \}$
  - ✓ State transition commands  $C = S \times Z$
- Inputs:
  - ✓ Encode either as selection of commands or in state transition commands.



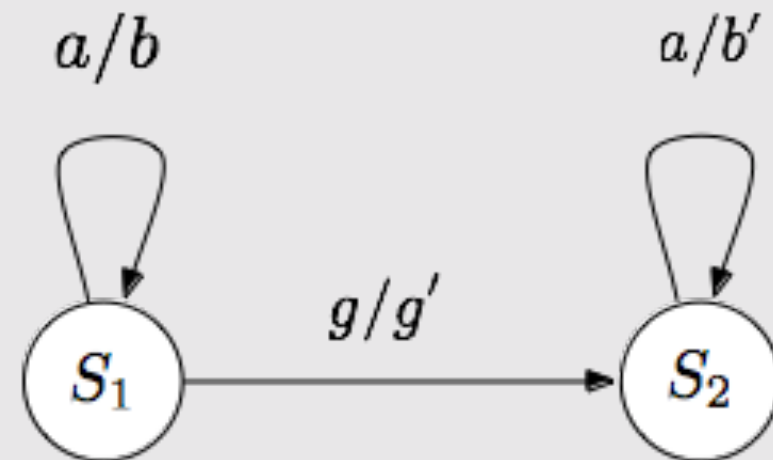
# Functions

- State transition function      $T: C \times \Sigma \rightarrow \Sigma$ 
  - ✓ Describe effect of executing command  $c$  in state  $\sigma$ .
- Output function      $P: C \times \Sigma \rightarrow O$ 
  - ✓ Output of machine when executing command  $c$  in state  $s$ .
- Initial state is  $\sigma_0$ .

# Example Semantics

- Finite state machine (also called Mealy machine)
  - ✓ *Step (T)* takes an input event and changes the state.
  - ✓ *Output (P)* takes an input event and shows the output event associated.

- $T(a, S_1) = S_1, T(g, S_1) = ?$
- $P(a, S_1) = b, P(a, S_2) = ?$



# States & Outputs

- States:  $T$  is inductive in first argument, as

$$T(c_0, \sigma_0) = \sigma_1; \quad T(c_{i+1}, \sigma_{i+1}) = T(c_{i+1}, T(c_i, \sigma_i))$$

- Let  $C^*$  be set of possible sequences of commands in  $C$
- $T^*: C^* \times \Sigma \rightarrow \Sigma$  and  
 $C_s = c_0, \dots, c_n \Rightarrow T^*(C_s, \sigma_0) = T(c_n, \dots, T(c_0, \sigma_0))$
- Similar definition for outputs  $P$  and  $P^*$

# Example: 2-bit Machine

- 2 bits of state info:  $H$  (high),  $L$  (low)
  - ✓ System state is  $(H, L)$  where  $H, L$  are 0, 1
- 2 users: Heidi (high), Lucy (low)
  - ✓ Heidi can read both high and low bit info.
  - ✓ Lucy can only read low bit info.
- 2 commands:  $xor0$ ,  $xor1$ 
  - ✓ Do  $xor$  on both bits with 0, 1.
  - ✓ Operations affect *both* state bits regardless of whether Heidi or Lucy issues it.

# Example: 2-bit Machine

- $S = \{ \text{Heidi, Lucy} \}$
- $\Sigma = \{ (0,0), (0,1), (1,0), (1,1) \}$
- $C = \{ \text{*xor0*, *xor1*} \}$

**State transition function:**

Input States ( $H, L$ )				
	(0,0)	(0,1)	(1,0)	(1,1)
<i>xor0</i>	(0,0)	(0,1)	(1,0)	(1,1)
<i>xor1</i>	(1,1)	(1,0)	(0,1)	(0,0)

# Example: 2-bit Machine

- Let  $\sigma_0 = (0, 1)$
- 3 commands applied:
  - ✓ Heidi applies *xor0*
  - ✓ Lucy applies *xor1*
  - ✓ Heidi applies *xor1*
- $c_s = ((\text{Heidi}, \text{xor0}), (\text{Lucy}, \text{xor1}), (\text{Heidi}, \text{xor1}))$
- Output  $P^* = 011001$ 
  - ✓ Shorthand for sequence  $(0,1) (1,0) (0,1)$

# Projection

- $T^*(c_s, \sigma_i)$ : sequence of state transitions for a system
- $P^*(c_s, \sigma_i)$ : corresponding outputs
- $proj(s, c_s, \sigma_i)$ : set of outputs in  $P^*(c_s, \sigma_i)$  that subject  $s$  is authorized to see
  - ✓ In same order as they occur in  $P^*(c_s, \sigma_i)$
  - ✓ Projection of outputs for  $s$
- **Intuition:** Removing outputs that  $s$  cannot see.

# Example

- $\sigma_0 = (0, 1)$ ,  $c_s = ((Heidi, xor0), (Lucy, xor1), (Heidi, xor1)) = 0\mathbf{1}1\mathbf{001}$
- $proj(Heidi, c_s, \sigma_0) = 0\mathbf{1}1\mathbf{001}$ 
  - ✓ Heidi can see both high and low bit outputs.
- $proj(Lucy, c_s, \sigma_0) = \mathbf{101}$ 
  - ✓ Lucy cannot see high bit outputs.



# Purge

- $G \subseteq S$ ,  $G$  is a group of subjects
- $A \subseteq Z$ ,  $A$  is a set of commands
- $\pi_G(c_s)$ : *subsequence of  $c_s$  with all elements  $(s,z)$ ,  $s \in G$  being deleted*
- $\pi_A(c_s)$ : *subsequence of  $c_s$  with all elements  $(s,z)$ ,  $z \in A$  being deleted*
- $\pi_{G,A}(c_s)$ : *subsequence of  $c_s$  with all elements  $(s,z)$ ,  $s \in G$  and  $z \in A$  being deleted*

# Example

- $\sigma_0 = (0, 1)$ ,  $c_s = ((Heidi, xor0), (Lucy, xor1), (Heidi, xor1)) = 0\mathbf{1}1\mathbf{001}$
- $\pi_{Lucy}(c_s) = (Heidi, xor0), (Heidi, xor1)$
- $\pi_{Lucy, xor1}(c_s) = (Heidi, xor0), (Heidi, xor1)$
- $\pi_{Lucy, xor0}(c_s) = (Heidi, xor0), (Lucy, xor1), (Heidi, xor1)$
- $\pi_{Heidi}(c_s) = (Lucy, xor1)$
- $\pi_{Heidi, xor1}(c_s) = (Heidi, xor0), (Lucy, xor1)$
- $\pi_{Heidi, xor0}(c_s) = \pi_{xor0}(c_s) = (Lucy, xor1), (Heidi, xor1)$
- $\pi_{xor1}(c_s) = (Heidi, xor0)$

# Non-interference

- **Intuition:** Set of outputs Lucy can see corresponds to set of inputs she can see, there is no interference.
- Formally:  $G, G' \subseteq S, G \neq G'; A \subseteq Z$ ; Users in  $G$  executing commands in  $A$  are non-interfering with users in  $G'$  iff for all  $c_s \in C^*$ , and for all  $s \in G'$ ,

$$proj(s, c_s, \sigma_i) = proj(s, \pi_{G,A}(c_s), \sigma_i)$$

written  $A, G :| G'$

# Example

- $\sigma_0 = (0, 1)$ ,  $c_s = ((Heidi, xor0), (Lucy, xor1), (Heidi, xor1)) = 0\textcolor{red}{1}1\textcolor{red}{0}0\textcolor{red}{1}$
- $G = \{ Heidi \}$ ,  $G' = \{ Lucy \}$ , and  $A = \emptyset$ .
- $\pi_{Heidi, A}(c_s) = (Lucy, xor1)$
- $proj(Lucy, \pi_{Heidi, A}(c_s), \sigma_0) = proj(Lucy, xor1, \sigma_0) = 0$
- $proj(Lucy, c_s, \sigma_0) = \textcolor{red}{101} \neq proj(Lucy, \pi_{Heidi, A}(c_s), \sigma_0) = 0$
- The statement  $\{ \textcolor{red}{Heidi} \} : \vdash \{ \textcolor{red}{Lucy} \}$  is false.
- **Intuition:** commands issued to change the  $H$  bit also affect the  $L$  bit.

# Information Flow

- Access controls can constrain the rights of a user, but they cannot constrain the flow of information about a system.
- When a system has a security policy regulating information flow, the system must ensure that the information flows do not violate the constraints of the policy.

# Language-based Security

- Consider the following property on a program  $P$  (which implies non-interference).
- Let  $h$  and  $l$  two variables in  $P$ .
- Example of  $P$ :

$$l = h$$

- Is it non-interferent?

# Language-based Security

- Consider the following property on a program  $P$  (which implies non-interference).
- Let  $h$  and  $l$  two variables in  $P$ .
- Example of  $P$ :

$$h = l$$

- What about now?

# Language-based Security

- Consider the following property on a program  $P$  (which implies non-interference).
- Let  $h$  and  $l$  two variables in  $P$ .
- Example of  $P$ :

```
 $l = 0$   
 $if\ (h == 1)$   
     $l = 1$   
 $else$   
     $l = 0$ 
```

- Now?



# Implicit Flows

- Why are these kind of properties interesting?
  - ✓ Implicit flows!
- It is in general not enough to track assignments to guarantee confidentiality. For instance:

*h* = 16 digit credit card number

*l* = 111111111111111111

*l* = *f*(*h*)

*f*(*h*) :

for *i*=0 ...length\_bits(*h*)

    if *h*[*i*] == 1:

*l*[*i*] = 0

# Basics

- Bell-LaPadula Model embodies information flow policy.
  - ✓ Given compartments  $A, B$ , information can flow from an object in  $A$  to a subject in  $B$  iff  $B \text{ dom } A$ .
- Variables  $x, y$  are assigned compartments  $\underline{x}, \underline{y}$  as well as values.
  - ✓ If  $\underline{x} = A$  and  $\underline{y} = B$ , and  $A \text{ dom } B$ , then  $y := x$  is allowed but not  $x := y$ .

# Entropy

- Uncertainty of a value, as measured in *bits*.
- Example:  $X$  is the value of fair coin toss;  $X$  could be heads or tails, so 1 bit of uncertainty.
  - ✓ Therefore entropy of  $X$  is  $H(X) = 1$
- Formal definition: random variable  $X$ , values  $x_1, \dots, x_n$ ;  
so  $\sum_i p(X = x_i) = 1$

$$H(X) = -\sum_i p(X = x_i) \lg p(X = x_i)$$

# Conditional Entropy

- $X$  takes values from  $\{x_1, \dots, x_n\}$ 
  - ✓  $\sum_i p(X=x_i) = 1$
- $Y$  takes values from  $\{y_1, \dots, y_m\}$ 
  - ✓  $\sum_i p(Y=y_i) = 1$
- Conditional entropy of  $X$  given  $Y=y_j$  is:
  - ✓  $H(X \mid Y=y_j) = -\sum_i p(X=x_i \mid Y=y_j) \lg p(X=x_i \mid Y=y_j)$
- Conditional entropy of  $X$  given  $Y$  is:
  - ✓  $H(X \mid Y) = -\sum_j p(Y=y_j) \sum_i p(X=x_i \mid Y=y_j) \lg p(X=x_i \mid Y=y_j)$

# Entropy & Information Flow

- $c$  is a sequence of commands taking a system from state  $s$  to state  $t$ .
- $x$  and  $y$  are objects in the system;  $x_s$  and  $y_s$  are values at state  $s$ .
- The command sequence  $c$  causes a *flow of information from  $x$  to  $y$*  if
  - ✓  $H(x_s / y_t) < H(x_s / y_s)$
- If  $y_s$  does not exist in  $s$ , then  $H(x_s / y_s) = H(x_s)$ .

# Example 1

- Command is  $x := y + z$ ; where:
  - ✓  $0 \leq y \leq 7$ , equal probability
  - ✓  $z = 1$  with prob.  $1/2$ ,  $z = 2$  or  $3$  with prob.  $1/4$  each
- $s$  is state before command executed;  $t$ , after; so
  - ✓  $H(y_s) = H(y_t) = -8(1/8) \lg (1/8) = 3$
  - ✓  $H(z_s) = H(z_t) = -(1/2) \lg (1/2) - 2(1/4) \lg (1/4) = 1.5$
- If you know  $x_t$ ,  $y_s$  can have at most 3 values (about  $z$ ), so
  - ✓  $H(y_s \mid x_t) = -3(1/3) \lg (1/3) = \lg 3$
- $H(y_s \mid x_t) = \lg 3 < H(y_s) = 3 \rightarrow$  information flows from  $y$  to  $x$ .

# Example 2

- Command is

*if  $x = 1$  then  $y := 0$  else  $y := 1$ ;*

where:

*$x, y$  equally likely to be either 0 or 1*

- $H(x_s) = 1$  as  $x$  can be either 0 or 1 with equal probability.
- $H(x_s \mid y_t) = 0$  as if  $y_t = 1$  then  $x_s = 0$  and vice versa.  
✓ Thus,  $H(x_s \mid y_t) = 0 < H(x_s) = 1$
- So information flows from  $x$  to  $y$ .

# Implicit Flow of Information

- Information flows from  $x$  to  $y$  without an *explicit* assignment of the form  $y := f(x)$ .
  - ✓  $f(x)$  is an arithmetic expression with variable  $x$ .
- Example from previous slide:
  - ✓ 
$$\begin{array}{l} \text{if } x = 1 \text{ then } y := 0 \\ \text{else } y := 1; \end{array}$$
- So must look for implicit flows of information to analyze program.



# Notation

- $\underline{x}$  means class of  $x$ .
  - ✓ In Bell-LaPadula based system, same as “label of security compartment to which  $x$  belongs”.
- $\underline{x} \leq \underline{y}$  means “information can flow from an element in class of  $x$  to an element in class of  $y$ .
  - ✓ Or, “information with a label placing it in class  $x$  can flow into class  $y$ ”.

# Compiler-based Mechanisms

- Detect unauthorized information flows in a program during compilation.
- Analysis not precise, but secure.
  - ✓ Not precise: A secure path of information flow may be marked as unauthorized (false positive).
  - ✓ Secure: No unauthorized path along which information could flow remains undetected.
- A set of statements is certified with respect to information flow policy if flows in that set of statements do not violate that policy.

# Example

*if*  $x = 1$  *then*  $y := a$   
                  *else*  $y := b$ ;

- Information flows from  $x$  and  $a$  to  $y$ , or from  $x$  and  $b$  to  $y$ .
- Certified only if  $\underline{x} \leq \underline{y}$  and  $\underline{a} \leq \underline{y}$  and  $\underline{b} \leq \underline{y}$ 
  - ✓ Note flows for *both* branches must be true unless compiler can determine that one branch will *never* be taken.

# Array Elements

- Information flowing out:

$\dots := a[i]$

- ✓ Values of  $i$ ,  $a[i]$  both affect result, so class is  $\max\{\underline{a[i]}, \underline{i}\}$ .

- Information flowing in:

$a[i] := \dots$

- ✓ Only value of  $a[i]$  affected, so class is  $\underline{a[i]}$ .

# Assignment Statements

$x := y + z;$

- ✓ Information flows from  $y, z$  to  $x$ , so this requires  $\max\{\underline{y}, \underline{z}\} \leq \underline{x}$ .

More generally:

$y := f(x_1, \dots, x_n)$

- ✓ The relation  $\max\{\underline{x}_1, \dots, \underline{x}_n\} \leq \underline{y}$  must hold.

# Compound Statements

$x := y + z; a := b * c - x;$

- ✓ First statement:  $\max\{\underline{y}, \underline{z}\} \leq \underline{x}$
- ✓ Second statement:  $\max\{\underline{b}, \underline{c}, \underline{x}\} \leq \underline{a}$
- ✓ So, both must hold (i.e., be secure).

More generally:

$S_1; \dots S_n;$

- ✓ Each individual  $S_i$  must be secure.

# Conditional Statements

*if*  $x + y < z$  *then*  $a := b$   
                                  *else*  $d := b * c - x;$

- ✓  $b \leq a, \{b, c, x\} \leq d$
- ✓ The statement executed reveals information about  $x, y, z$  (condition), so  $\max\{\underline{x}, \underline{y}, \underline{z}\} \leq \min\{\underline{a}, \underline{d}\}$ .

More generally:

*if*  $f(x_1, \dots, x_n)$  *then*  $S_1$  *else*  $S_2;$

- ✓  $S_1, S_2$  must be secure.
- ✓  $\max\{\underline{x}_1, \dots, \underline{x}_n\} \leq \min\{\underline{y} \mid y \text{ target of assignment in } S_1, S_2\}$ .

# Iterative Statements

```
while  $i < n$  do  
    begin  $a[i] := b[i];$   
         $i := i + 1;$   
    end;
```

- ✓ Same ideas as for “if”, but must terminate.

More generally:

```
while  $f(x_1, \dots, x_n)$  do  $S;$ 
```

- ✓ Loop must terminate. Why ?
- ✓  $S$  must be secure.
- ✓  $\max\{ \underline{x}_1, \dots, \underline{x}_n \} \leq \min\{ \underline{y} \mid \underline{y} \text{ target of assignment in } S \}.$



# Infinite Loops

```
y := 0;  
while x = 0 do  
    (* nothing *) ;  
y := 1;
```

- If  $x = 0$  initially, infinite loop.
- If  $x = 1$  initially, terminates with  $y$  set to  $1$ .
- No explicit flows, but implicit flow from  $x$  to  $y$ .
- However, hard to detect whether the loop will terminate at compile time.

# Execution-based Mechanisms

- Detect and stop flows of information that violate policy.
  - ✓ Done at run time, not compile time.
  - ✓ Before  $y = f(x_1, \dots, x_n)$  is executed, verify that

$$\max\{ \underline{x}_1, \dots, \underline{x}_n \} \leq y$$

- Obvious approach: check explicit flows.

# Execution-based Mechanisms

- Problem: Implicit flows complicate checking.
- Assume for security,  $\underline{x} \leq \underline{y}$   
*if  $x = 1$  then  $y := a$ ;*
- Explicit flow: cause a flow from  $x$  to  $y$ . Okay.
- Implicit flow: when  $x \neq 1$ ,  $\underline{x} = \text{High}$ ,  $\underline{y} = \text{Low}$ ,  $\underline{a} = \text{Low}$ 
  - ✓ The implicit flow will not be checked.
  - ✓ The statement may be incorrectly certified.

# Key Points

- Non-interference:
  - ✓ Alternative formulation of security policy models.
  - ✓ Assert a strict separation of subjects -- all channels, not merely those designed to transmit information, must be closed.
- Information Flow:
  - ✓ The amount of information flowing (entropy), and the way it flows.
  - ✓ *Explicit vs implicit* flows (side-channels)
  - ✓ *Compiler-based mechanism* assesses the flow of information in a program with respect to a given information flow policy.
  - ✓ *Execution-based mechanism* checks flows at run time. Either allow the flow to occur or block it.

# Exercises & Reading

- Classwork (Exercise Sheet 3): due on Fri Sept 28, 10:00 PM
- Homework (Exercise Sheet 3): due on Fri Oct 5, 6:59 PM
- Reading: MB [Ch8 (without 8.2.2 - 8.2.4, 8.3 - 8.5), Ch16 (without 16.2, 16.3.2.5, 16.3.4, 16.4.1, 16.4.2)]

**End of Slides for Week 3**