

Data Flow Testing



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Learning objectives

1. Understand why data flow criteria have been designed and used
2. Recognize and distinguish basic DF criteria
 - All DU pairs, all DU paths, all definitions, ...
3. Understand how the infeasibility problem impacts data flow testing

Motivation

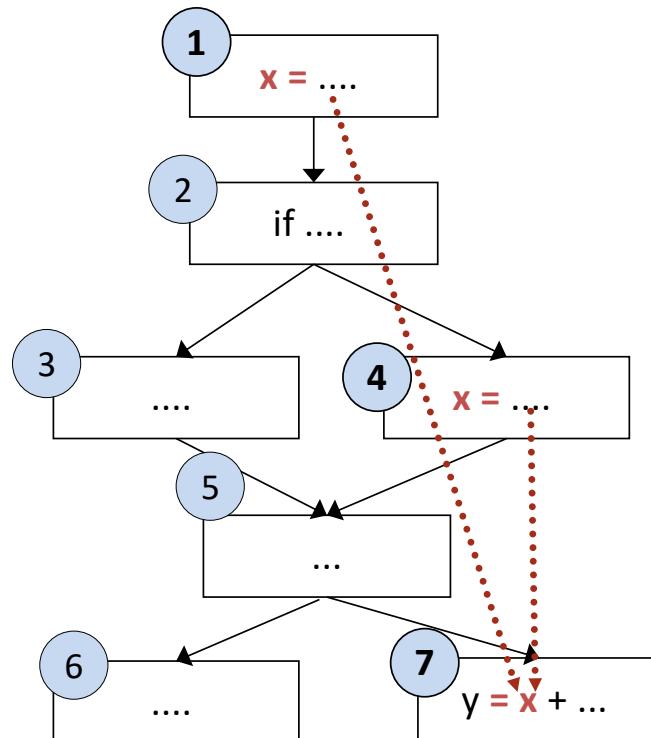
- Huge gap between **path** and **branch** coverage models
 - Path model is too strong
 - It is exhaustive but it still may miss significant test cases
 - It is often too time consuming
 - Path-based criteria require impractical number of test cases
 - And only a few paths uncover additional faults, anyway
 - Branch model is weak
 - Not exhaustive
 - May miss significant test cases
- Need another approach to distinguish “important” paths

Data flow testing

- Instead of focus on control flow of a program
- Focus on data flow of a program
 - Program reads variables, assigns new values to variables and performs computations
 - One can visualize the flow of data values from one statement to another
- Data Flow Testing focuses on
 - the points at which variables change value
 - and the points at which variables are read
- Intuition:
 - Statements interact through *data flow*
 - Value computed in one statement, used in another
 - Bad value computation revealed only when it is used

Data flow testing - 2

- Value of x at 7 could be computed at 1 or at 4
 - Bad computation at 1 or 4 could be revealed only if they are used at 7



Data operation categories

- **(d) Defined, Created, Initialized**
 - It assigned a value to the variable
 - A variable is **defined** when it:
 - appears in a data declaration
 - is assigned a new value
 - is a file that has been opened
 - is dynamically allocated
 - ...
- **(k) Killed, Undefined, Released**
 - Variable is deallocated at the statement fragment
 - The value and the location of the variable become unbound
- **(u) Used:**
 - The value of the variable is used in an expression

(u) Use operation

- A variable **v** is **used** in a statement **s** when its value is applied in an expression belonging to that statement
- Two types of **use**, depending on the type of the expression:
 - **predicate use (p-use)**: **v** appears in a predicate expression of **s**
 - if ($x > 5$) ...
 - **computational use (c-use)**: **v** appears in a *computation* expression of **s**
 - $y = 5 * x;$
 - c-use of x and def of y
- A variable is used for a computation (**c**) when it appears on the RHS (sometimes even the LHS in case of array indices) of an assignment statement.
- A variable is used in a predicate (**p**) when it appears directly in that predicate.

Use and definition - 1

- Variables are defined by assigning values to them and are used in expressions:
 - $x = y + z$
 - defines variable x and uses (**c-use**) variables y and z
 - `scanf ("%d %d", &x, &y)`
 - defines variables x and y
 - `printf ("Output: %d \n", x + y)`
 - uses variables (**c-use**) x and y
 - `if (x > 0)`
 - Uses variable (**p-use**) x
- A parameter x passed to a function
 - *call-by-value*, is considered as a *use* (**c-use**) of x
 - *call-by-reference*, is considered as a *definition* and *use* (**c-use**) of x

Use and definition - 2

- Variables can be used and re-defined in the same statement:
 - On both sides of an assignment
 - `x = x + 5;`
 - `x *= 5;`
 - As a call by reference parameter in function call
 - `increment(&y);`



Use and definition – Arrays

- Arrays are tricky
- Example:

```
int a[10];  
a[i] = x + y;
```

- Two approaches for second statement
 1. The second statement defines *a* and uses *i*, *x*, and *y*
 2. Or *second statement defines a[i]* and not the entire array *a*
 - The choice of whether to consider the entire array *a* as defined or the specific element *depends upon how stringent the requirement for coverage analysis is.*

Example: Use and definition

```
1. read (x, y);  
2. z = x + 2;  
3. if (z < y)  
4. w = x + 1;  
else  
5. y = y + 1;  
6. print (x, y, w, z);
```

What are the *definitions* and *uses* for this program?

<i>Lines</i>	<i>Def</i>	<i>C-use</i>	<i>P-use</i>
1	x, y		
2	z	x	
3			z, y
4	w	x	
5	y	y	
6		x, y, w, z	

Data flow testing: Two approaches

- Data flow testing can be performed at two conceptual levels.
 - Static data flow testing
 - Dynamic data flow testing
- Static data flow testing
 - Analyze source code
 - Do not execute code
 - Identify potential defects, commonly known as **data flow anomaly**
- Dynamic data flow testing
 - Involves actual program execution
 - Bears similarity with control flow testing
 - Identify paths to execute them
 - Paths are identified based on **data flow testing criteria**

Data flow anomaly

- Anomaly: It is an abnormal way of doing something.
 - Example 1: The second definition of x overrides the first.

```
x = f1(y);  
x = f2(z);
```
- Three types of abnormal situations with using variable.
 - Type 1: Defined and then defined again
 - Action sequence **dd**
 - Type 2: Undefined but referenced
 - Action sequence **-u**
 - Type 3: Defined but not referenced
 - Action sequence **dk**

Data flow anomaly

- Type 1 - Defined and then defined again
 - Four interpretations of example
 - First statement is redundant.
 - First statement has a fault -- the intended one might be: $w = f1(y)$.
 - The second statement has a fault – the intended one might be: $v = f2(z)$.
 - There is a missing statement in between the two: $v = f3(x)$.
 - Note: It is for the programmer to make the desired interpretation.
- Type 2 - Undefined but referenced
 - Example:
 - $x = y - w$; // w has not been defined by the programmer
 - Two interpretations
 - The programmer made a mistake in using w
 - The programmer wants to use the compiler assigned value of w
- Type 3 - Defined but not referenced
 - Example: Consider $x = f(x, y)$. If x is not used subsequently, we have a Type 3 anomaly.

$x = f1(y);$ →
 $x = f2(z);$

$\cancel{x = f1(y);}$
 $\cancel{x = f2(z);}$
 $x = f2(z);$

Dynamic data flow testing

- A family of coverage models
- Select paths by analyzing the program's data flow in order to explore sequences of events related to the status of data objects
- *E.g.*, Pick enough paths to assure that:
 - Every definition of a variable was used at least once
 - All uses of a definition have been exercised
- This family leads to test path selection strategies that fill the **gap** between **path** and **branch** coverage models

Overview of dynamic data flow testing

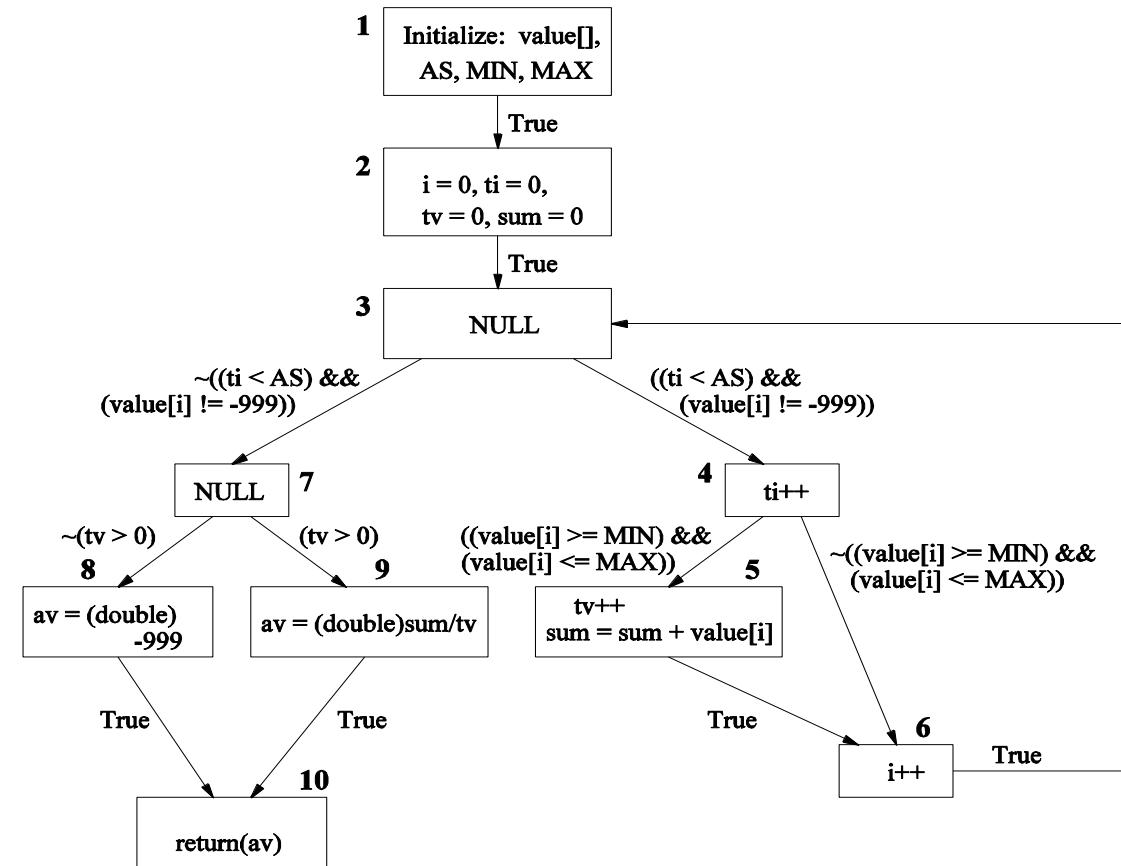
- A program manipulates/uses variables in several ways
 - Initialization, assignment of variables
 - And then used in a computation and/or condition
- Motivation for data flow testing?
 - One should not feel confident that a variable has been **assigned the correct value**, if no test causes the execution of a **path** from the point of assignment to a point where the value is **used**.
- The above motivation indicates that **certain kinds of paths** should be executed in data flow testing

Overview of dynamic data flow testing

- Data flow testing is outlined as follows:
 1. Draw a data flow graph from program P
 - Similar to control flow graph of P
 - All nodes, edges and paths of CGF are preserved
 - Can also consider one statement per node (makes analysis simpler)
 2. For each variable, classify each node as *defining* or *usage node*
 3. Select one or more data flow testing criteria
 - All-uses, all-defs, ...
 4. Identify paths in the data flow graph satisfying the testing criteria
 5. Compute input values for each path
 - Derive path predicate expressions from the selected paths
 - Solve the path predicate expressions to derive test inputs

Definition clear path

- Definition clear path (dc-path):**
A path $(i - n_1 - \dots - n_m - j)$, $m \geq 0$, is called a definition clear path (def-clear path) with respect to variable v if v has been neither defined nor undefined in nodes $n_1 - \dots - n_m$
 - def-clear path w.r.t. tv (node 2)
 - $(2 - 3 - 4 - 5)$
 - $(2 - 3 - 4 - 6)$
 - $(2 - 3 - 4 - 6 - 3 - 4 - 6 - 3 - 4 - 5)$
 - $(2 - 3 - 4 - 5 - 6 - 3 - 4 - 5) \times$
 - def-clear path w.r.t. tv (node 5)
 - $(5 - 6 - 3 - 4 - 5)$



More dataflow terms and definitions

- A ***definition-use pair (“du-pair”)*** with respect to a variable **v** is a pair **(d,u)** such that
 - **d** is a node in the program’s flow graph at which **v** is defined,
 - **u** is a node or edge at which **v** is used *and*
 - there is at least one **def-clear path** *with respect to v* from **d** to **u**
 - In other words, there is at least one path (d, \dots, u) such that the value that is assigned to **v** at **d** is used at **u**
- DU-pair : A pair of nodes **(i, j)** (or **(i, <j, k>)**) such that a variable **v** is defined at **i** and that value is used at **j** (or **<j, k>**)
- Note that the definition of a du-pair does not require the existence of a **feasible** def-clear path from **d** to **u**

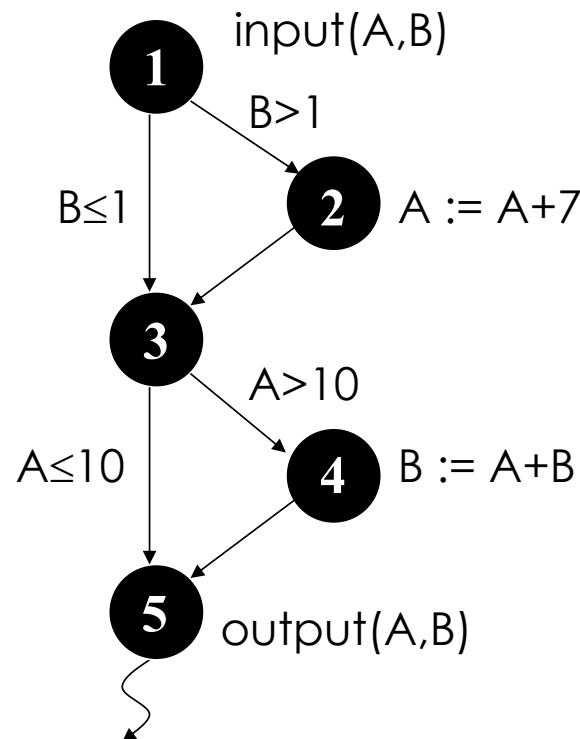
Example 1

```

1. input(A,B)
   if (B > 1)
2.   A = A + 7
3. if (A > 10)
4.   B = A + B
5. output(A, B)

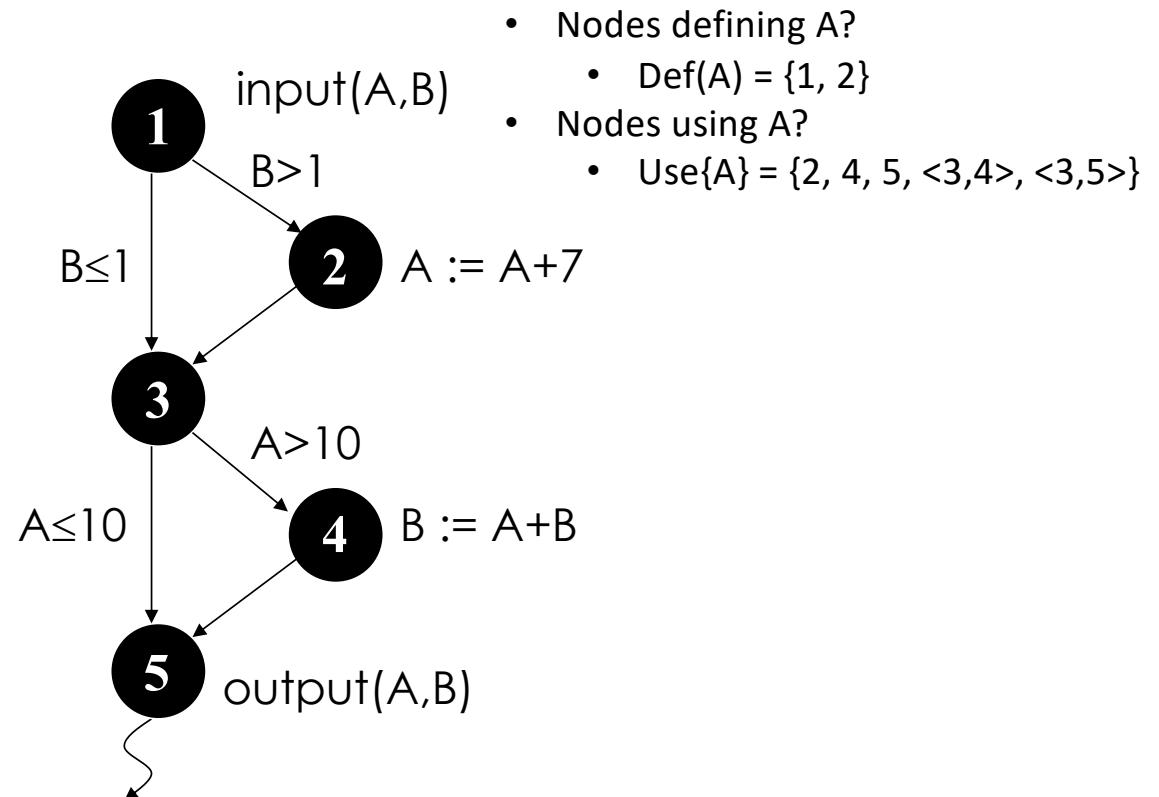
```

- **Data flow testing**
 - Compute the du-pairs and dc-paths for each variable



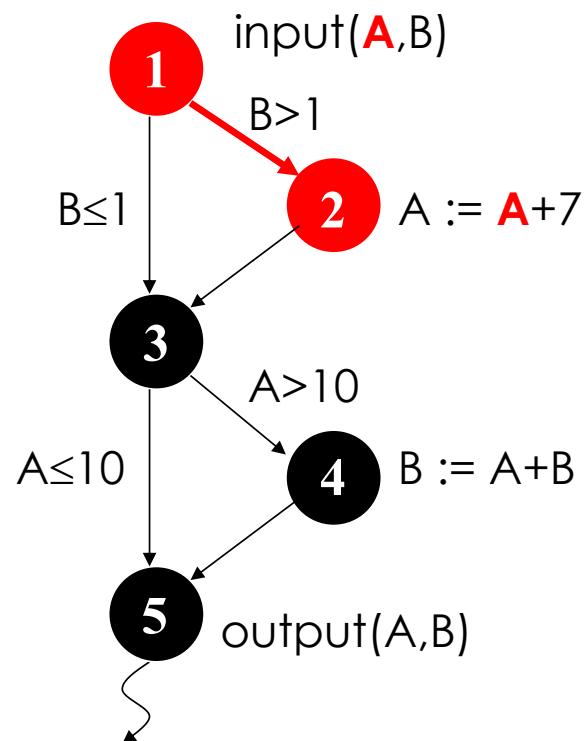
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	
(1,4)	
(1,5)	
(1,<3,4>)	
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



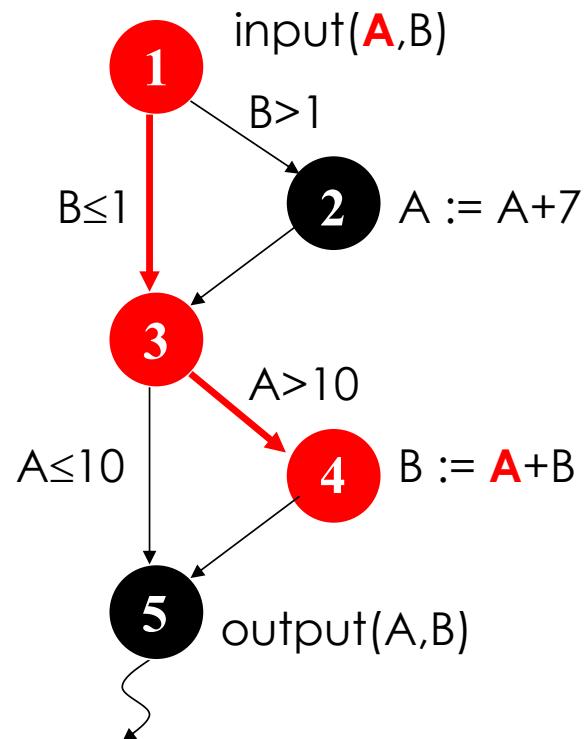
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	
(1,5)	
(1,<3,4>)	
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



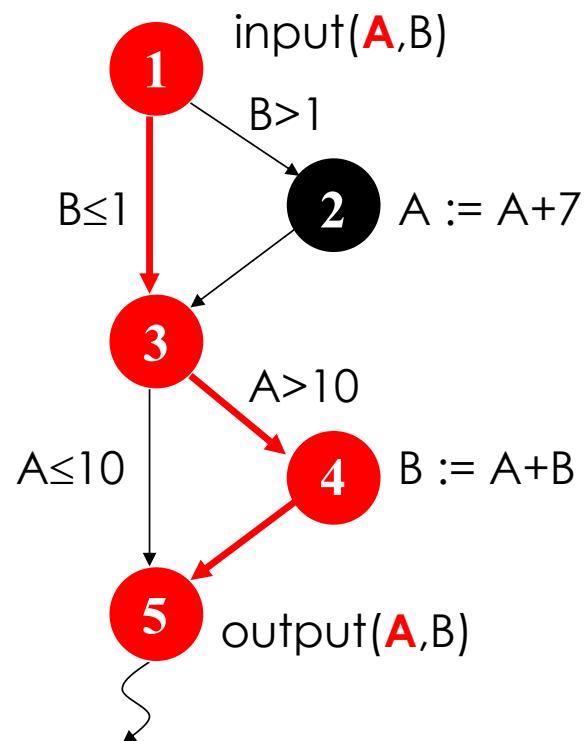
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	
(1,<3,4>)	
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



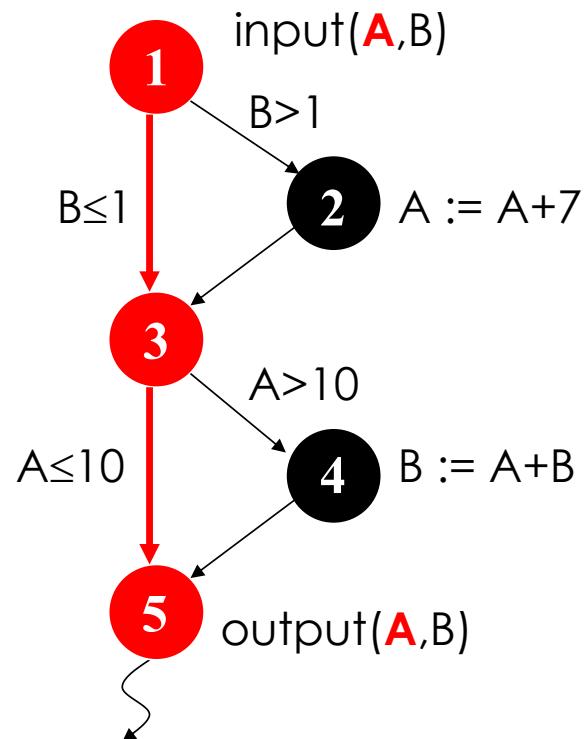
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
(1,<3,4>)	
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



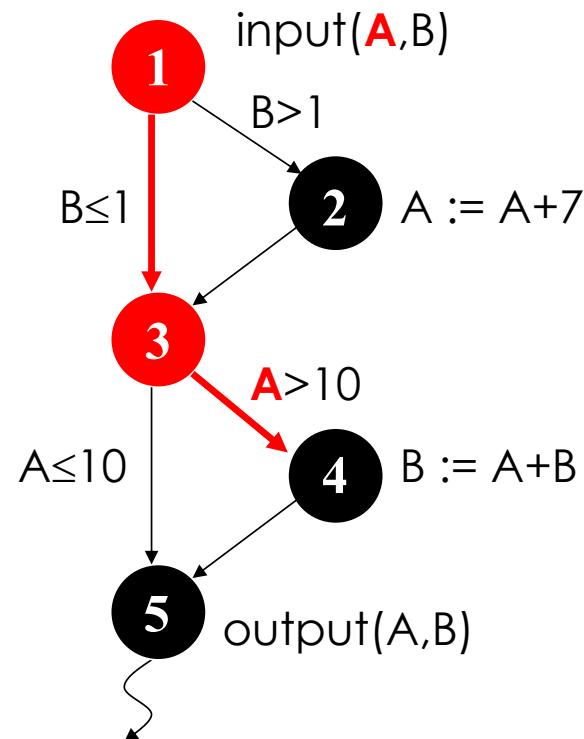
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5> <1,3,5>
(1,<3,4>)	
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



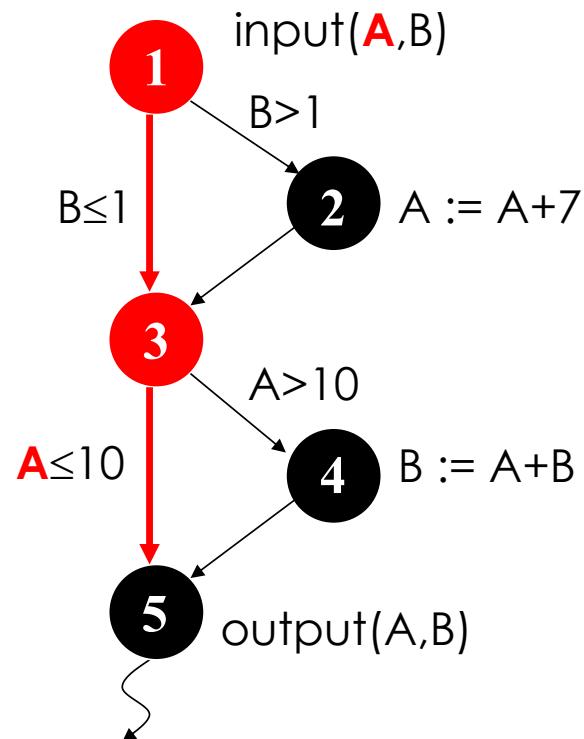
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



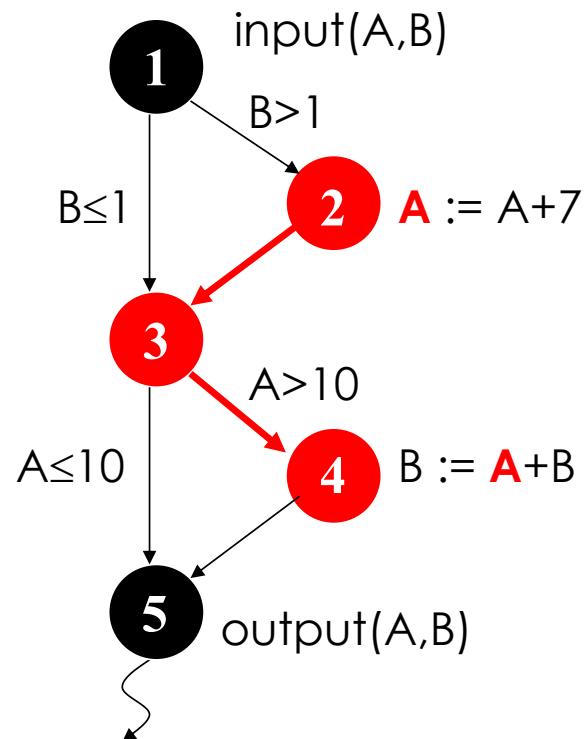
Identifying DU-Pairs – Variable A

du-pair	path(s)
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



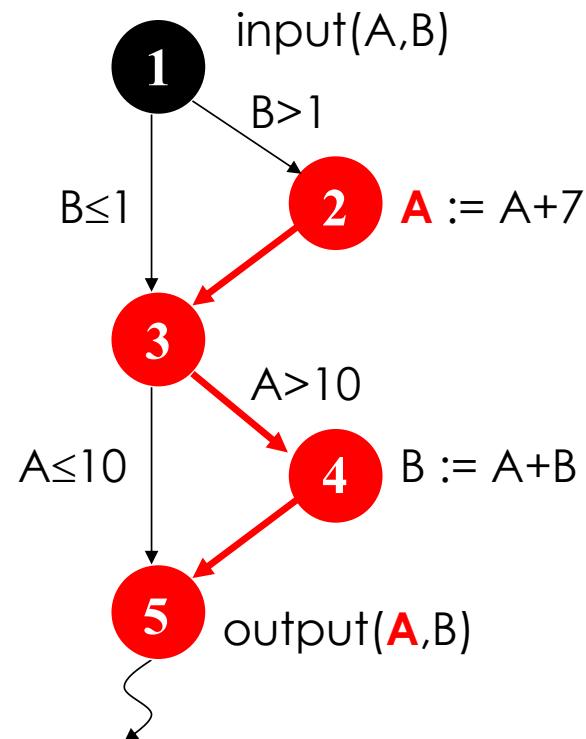
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	<2,3,4>
(2,5)	
(2,<3,4>)	
(2,<3,5>)	



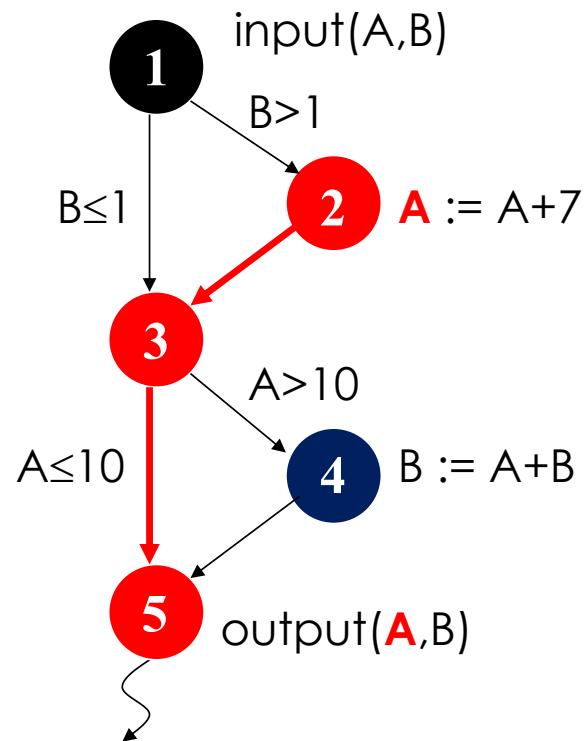
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	<2,3,4>
(2,5)	<2,3,4,5>
(2,<3,4>)	
(2,<3,5>)	



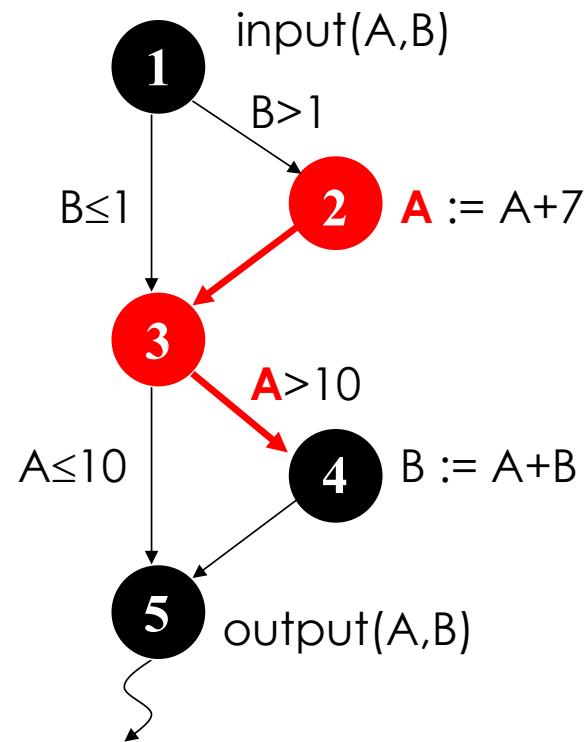
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	<2,3,4>
(2,5)	<2,3,4,5>
	<2,3,5>
(2,<3,4>)	
(2,<3,5>)	



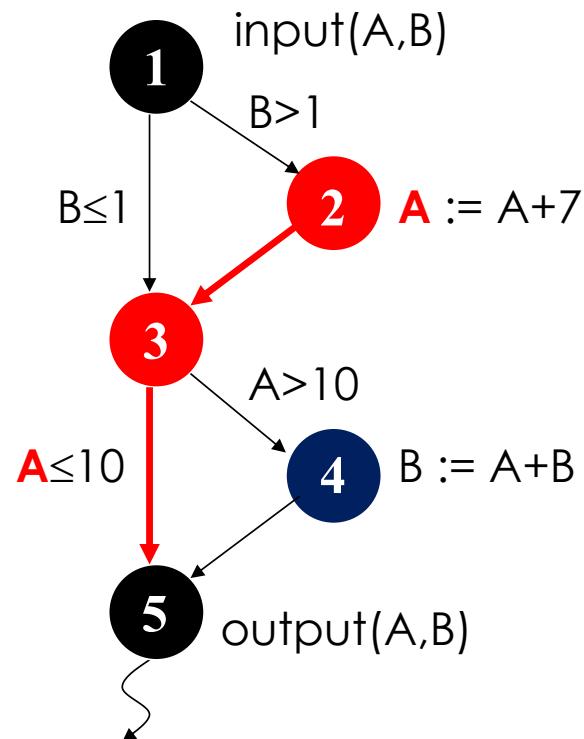
Identifying DU-Pairs – Variable A

du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	<2,3,4>
(2,5)	<2,3,4,5>
	<2,3,5>
(2,<3,4>)	<2,3,4>
(2,<3,5>)	



Identifying DU-Pairs – Variable A

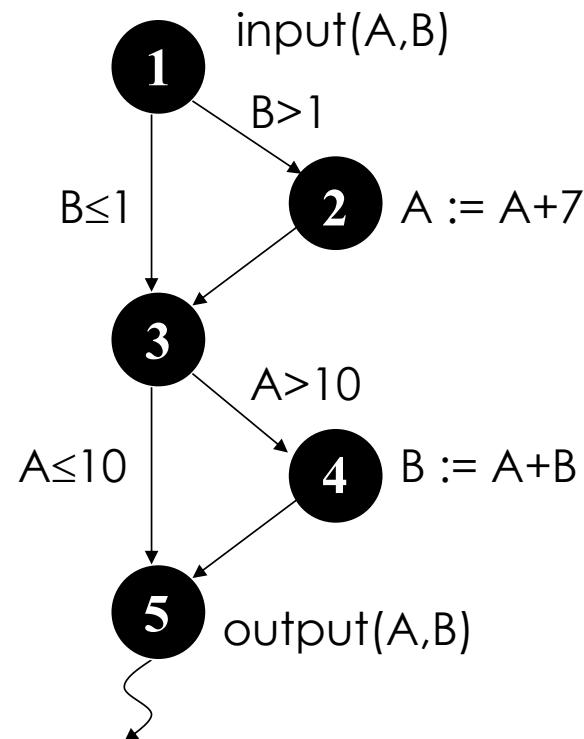
du-pair	dc-path
(1,2)	<1,2>
(1,4)	<1,3,4>
(1,5)	<1,3,4,5>
	<1,3,5>
(1,<3,4>)	<1,3,4>
(1,<3,5>)	<1,3,5>
(2,4)	<2,3,4>
(2,5)	<2,3,4,5>
	<2,3,5>
(2,<3,4>)	<2,3,4>
(2,<3,5>)	<2,3,5>



Identifying DU-Pairs – Variable B

- Nodes defining B?
 - $\text{Def}(B) = \{1, 4\}$
- Nodes using B?
 - $\text{Use}\{B\} = \{4, 5, <1,2>, <1,3>\}$

du-pair	dc-path
(1,4)	<1,2,3,4>
	<1,3,4>
(1,5)	<1,2,3,5>
	<1,3,5>
(1,<1,2>)	<1,2>
(1,<1,3>)	<1,3>
(4,5)	<4,5>



Frankl and Weyuker's Data flow coverage criteria

- Seven data flow testing criteria
 - **All-defs**
 - **All-uses**
 - All-c-uses
 - All-p-uses
 - All-p-uses/some-c-uses
 - All-c-uses/some-p-uses
 - **All-du-paths**
- The family of data flow criteria requires that the test data execute definition-clear paths from each node containing a definition of a variable to specified nodes containing *c-use* and edges containing *p-use* of that variable.

All-Defs coverage criterion

- ***All-Defs***

For **every program variable v** ,
at least one def-clear path from every definition of v
to **at least one c-use or one p-use of v** must be covered

➤ Meaning: All definitions get used at least once

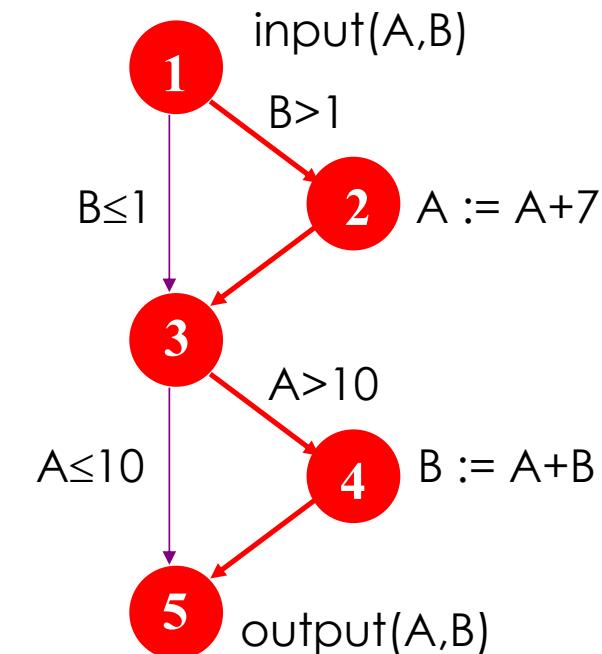
All-Defs coverage criterion - Example

- Consider a test case executing complete path $<1,2,3,4,5>$
 - **Complete path:** A complete path is a path from the entry node to the exit node
 - Corresponds to the entry-exit node of CF models
- Identify **all def-clear paths covered (ie subsumed)** by this path for each variable
- Are **all definitions for each variable** associated with at least one of the subsumed def-clear paths?

Def-Clear Paths subsumed by $\langle 1,2,3,4,5 \rangle$ for Variable A and B

du-pair for A	dc-path
(1,2)	$\langle 1,2 \rangle$ ✓
(1,4)	$\langle 1,3,4 \rangle$
(1,5)	$\langle 1,3,4,5 \rangle$
	$\langle 1,3,5 \rangle$
(1,<3,4>)	$\langle 1,3,4 \rangle$
(1,<3,5>)	$\langle 1,3,5 \rangle$
(2,4)	$\langle 2,3,4 \rangle$ ✓
(2,5)	$\langle 2,3,4,5 \rangle$ ✓ $\langle 2,3,5 \rangle$
(2,<3,4>)	$\langle 2,3,4 \rangle$ ✓
(2,<3,5>)	$\langle 2,3,5 \rangle$

du-pair for B	dc-path
(1,4)	$\langle 1,2,3,4 \rangle$ ✓
	$\langle 1,3,4 \rangle$
(1,5)	$\langle 1,2,3,5 \rangle$
	$\langle 1,3,5 \rangle$
(4,5)	$\langle 4,5 \rangle$ ✓
(1,<1,2>)	$\langle 1,2 \rangle$ ✓
(1,<1,3>)	$\langle 1,3 \rangle$



- Since $\langle 1,2,3,4,5 \rangle$ covers at least one def-clear path from every definition of A or B to at least one c-use or p-use of A or B, All-Defs coverage is achieved with a single test case

All-Uses coverage criterion

- All-Uses coverage criterion:

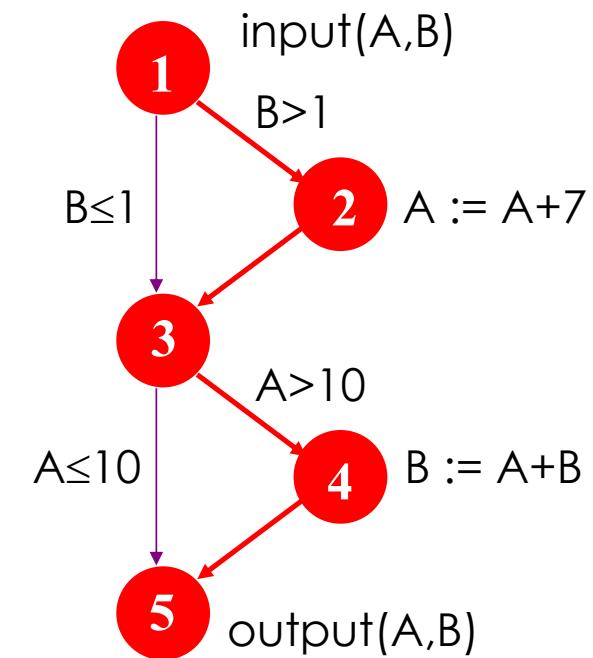
For **every program variable v**,
at least one def-clear path from **every definition of v**
to every c-use and every p-use of v must be covered

- Requires all du-pairs are exercised at least once
- Meaning: Every computation and branch directly affected by a definition is exercised

Does $<1,2,3,4,5>$ achieves All-Uses for variables A and B?

du-pair for A	dc-path
(1,2)	$<1,2>$ ✓
(1,4)	$<1,3,4>$
(1,5)	$<1,3,4,5>$
	$<1,3,5>$
(1,<3,4>)	$<1,3,4>$
(1,<3,5>)	$<1,3,5>$
(2,4)	$<2,3,4>$ ✓
(2,5)	$<2,3,4,5>$ ✓
	$<2,3,5>$
(2,<3,4>)	$<2,3,4>$ ✓
(2,<3,5>)	$<2,3,5>$

du-pair for B	dc-path
(1,4)	$<1,2,3,4>$ ✓
	$<1,3,4>$
(1,5)	$<1,2,3,5>$
	$<1,3,5>$
(4,5)	$<4,5>$ ✓
(1,<1,2>)	$<1,2>$ ✓
(1,<1,3>)	$<1,3>$

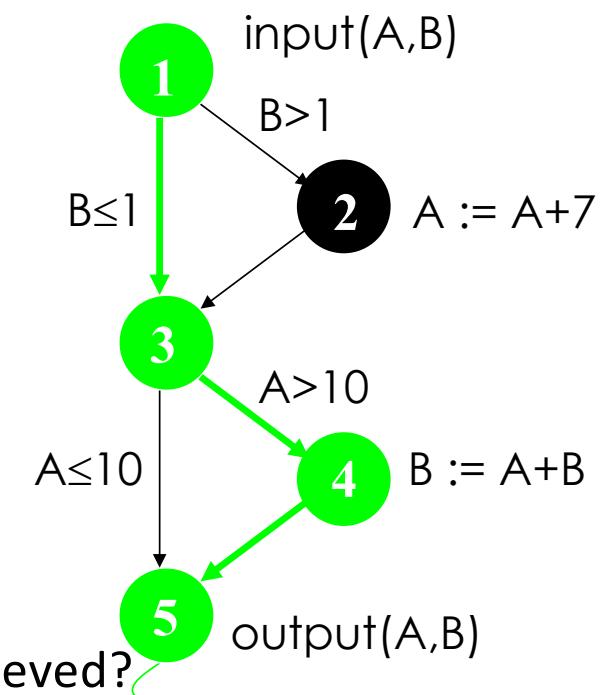


- No! For example (1,4) and (1,5) for A are not covered
- Consider additional test cases executing paths:
 - $<1,3,4,5>$
 - $<1,2,3,5>$

Def-Clear paths subsumed by $\langle 1,3,4,5 \rangle$

du-pair for A	dc-path
(1,2)	$\langle 1,2 \rangle$ ✅
(1,4)	$\langle 1,3,4 \rangle$ ✅
(1,5)	$\langle 1,3,4,5 \rangle$ ✅
	$\langle 1,3,5 \rangle$
(1,<3,4>)	$\langle 1,3,4 \rangle$ ✅
(1,<3,5>)	$\langle 1,3,5 \rangle$
(2,4)	$\langle 2,3,4 \rangle$ ✅
(2,5)	$\langle 2,3,4,5 \rangle$ ✅
	$\langle 2,3,5 \rangle$
(2,<3,4>)	$\langle 2,3,4 \rangle$ ✅
(2,<3,5>)	$\langle 2,3,5 \rangle$

du-pair for B	dc-path
(1,4)	$\langle 1,2,3,4 \rangle$ ✅
	$\langle 1,3,4 \rangle$ ✅
(1,5)	$\langle 1,2,3,5 \rangle$
	$\langle 1,3,5 \rangle$
(4,5)	$\langle 4,5 \rangle$ ✅
(1,<1,2>)	$\langle 1,2 \rangle$ ✅
(1,<1,3>)	$\langle 1,3 \rangle$ ✅

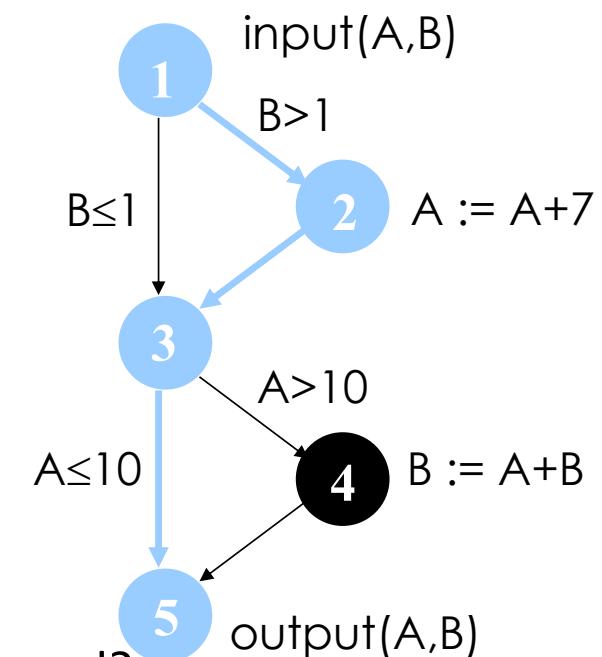


- Is the All-Uses coverage achieved?
- No! Du-pairs not exercised yet:
 - Variable A : du-pair (1,<3,5>) and (2,<3,5>)
 - Variable B: du-pair (1, 5)

Def-Clear paths subsumed by $\langle 1,2,3,5 \rangle$

du-pair for A	dc-path
(1,2)	$\langle 1,2 \rangle$ ✓ ✅
(1,4)	$\langle 1,3,4 \rangle$ ✓
(1,5)	$\langle 1,3,4,5 \rangle$ ✓
	$\langle 1,3,5 \rangle$
(1,<3,4>)	$\langle 1,3,4 \rangle$ ✓
(1,<3,5>)	$\langle 1,3,5 \rangle$
(2,4)	$\langle 2,3,4 \rangle$ ✓
(2,5)	$\langle 2,3,4,5 \rangle$ ✓
	$\langle 2,3,5 \rangle$ ✅
(2,<3,4>)	$\langle 2,3,4 \rangle$ ✓
(2,<3,5>)	$\langle 2,3,5 \rangle$ ✅

du-pair for B	dc-path
(1,4)	$\langle 1,2,3,4 \rangle$ ✓
	$\langle 1,3,4 \rangle$ ✓
(1,5)	$\langle 1,2,3,5 \rangle$ ✅
	$\langle 1,3,5 \rangle$
(4,5)	$\langle 4,5 \rangle$ ✓ ✓
(1,<1,2>)	$\langle 1,2 \rangle$ ✓ ✅
(1,<1,3>)	$\langle 1,3 \rangle$ ✓



- Is the All-Uses coverage achieved?
- None of the three test cases covers the du-pair $(1,<3,5>)$ for variable A
 - All-Uses Coverage is not achieved
 - Need additional test case

More data flow coverage criteria

- Given the set V of variables of program P
- **All-P-Uses:**
 - For every variable v in V , at least one dc-path from every definition of v to every P-use of v must be covered
- **All-C-Uses:**
 - For every variable v in V , at least one dc-path from every definition of v to every C-use of v must be covered

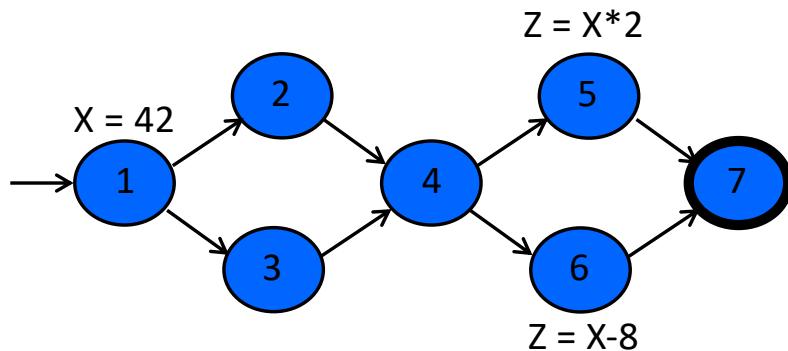
More data flow coverage criteria - 2

- Given the set V of variables of program P
- **All-P-Uses/Some-C-Uses:**
 - For every variable v in V , at least one dc-path from every definition of v to every P -use of v must be covered
 - If a definition of v has no P -uses, at least one dc-path from the definition of v to a C -use of v must be covered
- **All-C-Uses/Some-P-Uses:**
 - For every variable v in V , at least one dc-path from every definition of v to every C -use of v must be covered
 - If a definition of v has no C -uses, at least one dc-path from the definition of v to a P -use of v must be covered

All-DU-Paths coverage criterion

- **Simple path:** A simple path is a path in which all nodes, except possibly the first and the last, are distinct
 - 1-2-3-4-5-9 and 1-3-4-5-2-1 are simple paths
 - 1-2-3-4-5-3-7 and 1-2-3-4-1-6-5-8 are not simple paths
- A path $\langle n_1, n_2, \dots, n_j, n_k \rangle$ is a **du-path** wrt a variable **v** if
 1. **v** is defined at node n_1 and
 2. there is a **c-use** of **v** at node n_k or a **p-use** of **v** at edge $\langle n_j, n_k \rangle$ and
 3. $\langle n_1, n_2, \dots, n_j, n_k \rangle$ is a def-clear **simple** path
- **All DU-Paths criterion:**
for **every program variable v**,
every du-path
from **every definition** of **v** to **every c-use** and **every p-use** of **v** must be covered

Data flow testing example



- Nodes defining X?
 - $\text{Def}(X) = \{1\}$
- Nodes using X?
 - $\text{Use}\{X\} = \{5, 6\}$

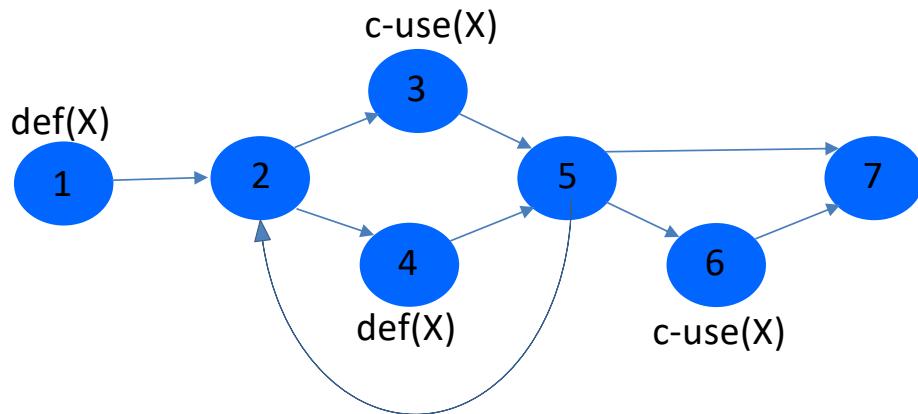
du-pair	dc-path	
(1, 5)	< 1, 2, 4, 5 >	✓
	< 1, 3, 4, 5 >	✓
(1,6)	< 1, 2, 4, 6 >	✓
	< 1, 3, 4, 6 >	✓

Determine a minimal test suite
that achieves 100% coverage for:

- All-defs
- All-uses
- All-du-paths

All-defs for X	All-uses for X	All-du-paths for X
[1, 2, 4, 5, 7]	[1, 2, 4, 5, 7] [1, 2, 4, 6, 7]	[1, 2, 4, 5, 7] [1, 2, 4, 6, 7] [1, 3, 4, 5, 7] [1, 3, 4, 6, 7]

Data Flow Testing Example - 2



Determine a minimal test suite
that achieves 100% coverage for:

- All-defs
- All-uses
- All-du-paths

du-pair	dc-path	Du-path
(1, 3)	< 1, 2, 3 >	✓
(1, 6)	< 1, 2, 3, 5, 6 >	✓
	< 1, (2, 3, 5)+ , 6 >	✗
(4, 3)	< 4, 5, 2, 3 >	✓
(4, 6)	< 4, 5, 2, 3 , 5, 6 >	✗
	< 4, (5,2,3)+,5, 6 >	✗
	< 4, 5 , 6 >	✓

All-defs for X	All-uses for X	All-du-paths for X	All-du-paths for X
[1, 2, 3, 5, 2, 4, 5, 6 , 7]	[1, 2, 3, 5, 6 ,7] [1, 2, 4, 5, 2, 3, 5, 6, 7]	[1, 2, 3, 5, 6, 7] [1, 2, 4, 5, 2, 3, 5, 6, 7] [1, 2, 4, 5 ,6, 7]	[1, 2, 3, 5, 6, 7] [1, 2, 4, 5, 2, 3, 5, 2, 4, 5, 6, 7]

Relationship between strategies

