

Dataflow Analysis

15-411/15-611 Compiler Design

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Today

- Full Employment Theorem
- Local Optimization: Value Numbering
- Dataflow Analysis
 - reaching definitions
 - liveness
 - available expressions
 - very busy expressions
- Framework

Optimizations

- Register Allocation
- Common subexpression elimination
- Constant Propagation
- Copy propagation
- Dead-code elimination
- Loop optimizations
 - Hoisting
 - Induction variable elimination
- And, many many more.

How many?

Infinitely Many!

- Lets assume there existed
optc: A perfect optimizing compiler
- $\text{optc}(P) \Rightarrow$ the smallest possible P' which
has equivalent behavior to P .
- Then, ?

Infinitely Many!

- Lets assume there existed
optc: A perfect optimizing compiler
- $\text{optc}(P) \Rightarrow$ the smallest possible P' which has equivalent behavior to P .
- Then, if P never halts, it should produce:
$$L1 : \text{jmp } L1$$
- So, instead we build “optimizing compilers” and there is always a job for a compiler writer to invent new optimizations!

Approach to Optimization

- Three parts to any optimization:
 - Determine if an optimization is legal
 - Determine if an optimization is profitable
 - Implement optimization
- Consider also compilation time

Scope of Optimization

- Local
 - Within a basic block
- Global
 - Within a function, across basic blocks
- Interprocedural
 - The entire program (file), across functions and basic blocks.
- Whole program
 - Across all the files

Value Numbering

- (Originally) A local optimization for:
 - common sub-expression elimination
 - constant folding
 - constant propagation
 - dead-code removal
- A long history
- An ancestor to SSA

Local Value Numbering

- Goal: recognize that $X \oplus Y$ is redundant and eliminate redundant operation
- Idea: Assign a value number, $V(\text{exp})$, to each expression such that:
$$V(\text{exp}) = V(X \oplus Y) \text{ iff}$$
$$X \oplus Y \text{ has same value as exp (on all paths)}$$

Beware:

$$a \leftarrow x + y$$

$$b \leftarrow x + y$$

$$x \leftarrow 5$$

$$c \leftarrow x + y$$

Value Numbering Example

```
void quicksort(int m, int n) {  
    int i = m-1;  
    int j = n;  
    int v;  
    int x;  
    if n <= m then return;  
    v = a[n];  
    while (true) {  
        i = i+1;  
        while (a[i] < v) i = i+1;  
        j = j-1;  
        while (a[j] > v) j = j-1;  
        if i>=j break;  
        x = a[i]; a[i] = a[j]; a[j] = x  
    }  
    x = a[i]; a[i] = a[n]; a[n] = x;  
    quicksort(m,j);  
    quicksort(i+1), n);  
}
```

Example: CSE

```
void quicksort(int m, int n) {  
    int i = m-1;  
    int j = n;  
    int v;  
    int x;  
    if n <= m then return;  
    v = a[n];  
    while (true) {  
        i = i+1;  
        while (a[i] < v) i = i+1;  
        j = j-1;  
        while (a[j] > v) j = j-1;  
        if i>=j break;  
        x = a[i]; a[i] = a[j]; a[j] = x  
    }  
    x = a[i]; a[i] = a[n]; a[n] = x;  
    quicksort(m,j);  
    quicksort(i+1), n);  
}
```

B1: i = m - 1
j = n
t1 = 4*n
v = a[t1]

B2: i = i + 1
t2 = 4 * i
t3 = a[t2]
cjump t3<v B2, B3

B3: j = j - 1
t4 = 4 * j
t5 = a[t4]
cjump t5>v B3, B4

B4: cjump i>=j B6, B5

Example: CSE

```
void quicksort(int m, int n) {  
    int i = m-1;  
    int j = n;  
    int v;  
    int x;  
    if n <= m then return;  
    v = a[n];  
    while (true) {  
        i = i+1;  
        while (a[i] < v) i = i+1;  
        j = j-1;  
        while (a[j] > v) j = j-1;  
        if i>=j break;  
        x = a[i]; a[i] = a[j]; a[j] = x  
    }  
    x = a[i]; a[i] = a[n]; a[n] = x;  
    quicksort(m, j);  
    quicksort(i+1), n);  
}
```

B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2

B6: t11 = 4*i
x = a[t11]
t12 = 4 * i
t13 = 4 * n
t14 = a[t13]
a[t12] = t14
t15 = 4*n
a[t15] = x

Example: CSE

B1: i = m - 1
 j = n
 t1 = 4*n
 v = a[t1]

B2: i = i + 1
 t2 = 4 * i
 t3 = a[t2]
 cjump t3 < v B2 , B3

B3: j = j - 1
 t4 = 4 * j
 t5 = a[t4]
 cjump t5 > v B3 , B4

B4: cjump i >= j B6 , B5

B5: t6 = 4*i
 x = a[t6]
 t7 = 4 * i
 t8 = 4 * j
 t9 = a[t8]
 a[t7] = t9
 t10 = 4*j
 a[t10] = x
 jump B2

B6: t11 = 4*i
 x = a[t11]
 t12 = 4 * i
 t13 = 4 * n
 t14 = a[t13]
 a[t12] = t14
 t15 = 4*n
 a[t15] = x

Local CSE

B1: i = m - 1
 j = n
 t1 = 4*n
 v = a[t1]

B2: i = i + 1
 t2 = 4 * i
 t3 = a[t2]
 cjump t3 < v B2 , B3

B3: j = j - 1
 t4 = 4 * j
 t5 = a[t4]
 cjump t5 > v B3 , B4

B4: cjump i >= j B6 , B5

B5: t6 = 4*i
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B6: t11 = 4*i
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Local CSE

B1:	i = m - 1 j = n t1 = 4*n v = a[t1]	B5:	t6 = 4*i x = a[t6] t7 = 4 * i t8 = 4 * j t9 = a[t8] a[t6] = t9 t10 = 4*j a[t8] = x jump B2
B2:	i = i + 1 t2 = 4 * i t3 = a[t2] cjump t3 < v B2, B3	B6:	t11 = 4*i x = a[t11] t12 = 4 * i t13 = 4 * n t14 = a[t13] a[t11] = t14 t15 = 4*n a[t13] = x
B3:	j = j - 1 t4 = 4 * j t5 = a[t4] cjump t5 > v B3, B4		
B4:	cjump i >= j B6, B5		

Local CSE

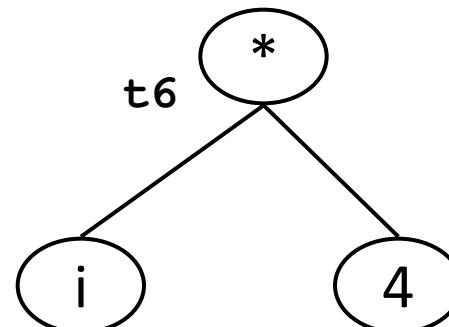
B1:	i = m - 1 j = n t1 = 4*n v = a[t1]	B5:	t6 = 4*i x = a[t6] t8 = 4 * j t9 = a[t8] a[t6] = t9
B2:	i = i + 1 t2 = 4 * i t3 = a[t2] cjump t3 < v B2, B3		a[t8] = x jump B2
B3:	j = j - 1 t4 = 4 * j t5 = a[t4] cjump t5 > v B3, B4	B6:	t11 = 4*i x = a[t11] t13 = 4 * n t14 = a[t13] a[t11] = t14
B4:	cjump i >= j B6, B5		a[t13] = x

How do we find this?

Build a DAG

```
B5: t6      = 4*i  
      x      = a[t6]  
      t7      = 4 * i  
      t8      = 4 * j  
      t9      = a[t8]  
      a[t7]   = t9  
      t10     = 4*j  
      a[t10]  = x  
      jump    B2
```

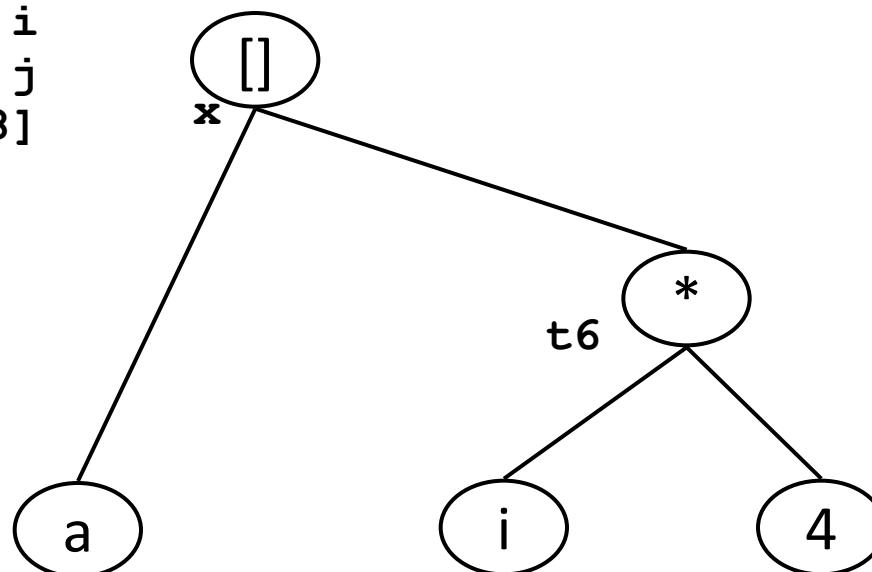
- For each var & constant not seen before create a leaf
- For each op, create a node and label with lvalue



Build a DAG

```
B5: t6      = 4*i  
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      t7      = 4 * i  
      t8      = 4 * j  
      t9      = a[t8]  
      a[t7]   = t9  
      t10     = 4*j  
      a[t10]  = x  
      jump    B2
```

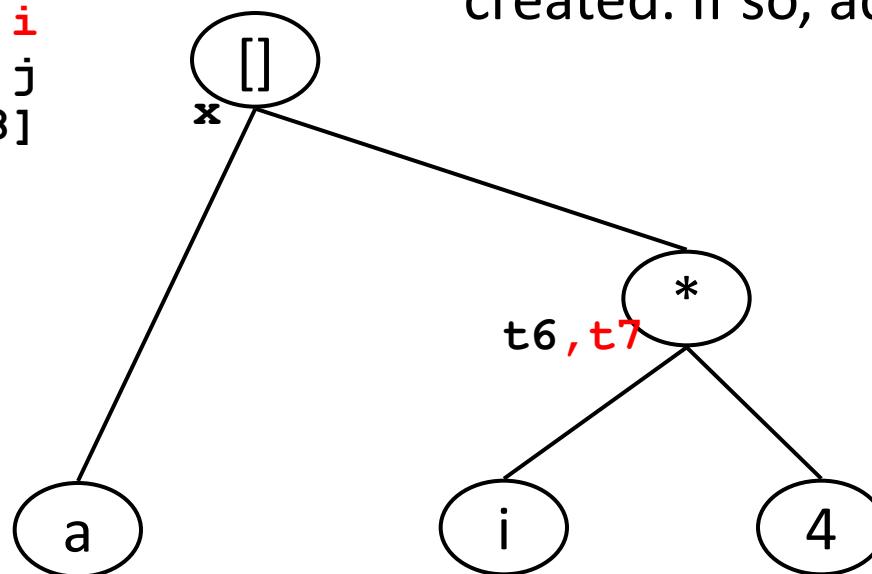
- For each var & constant not seen before create a leaf
- For each op, create a node and label with lvalue



Build a DAG

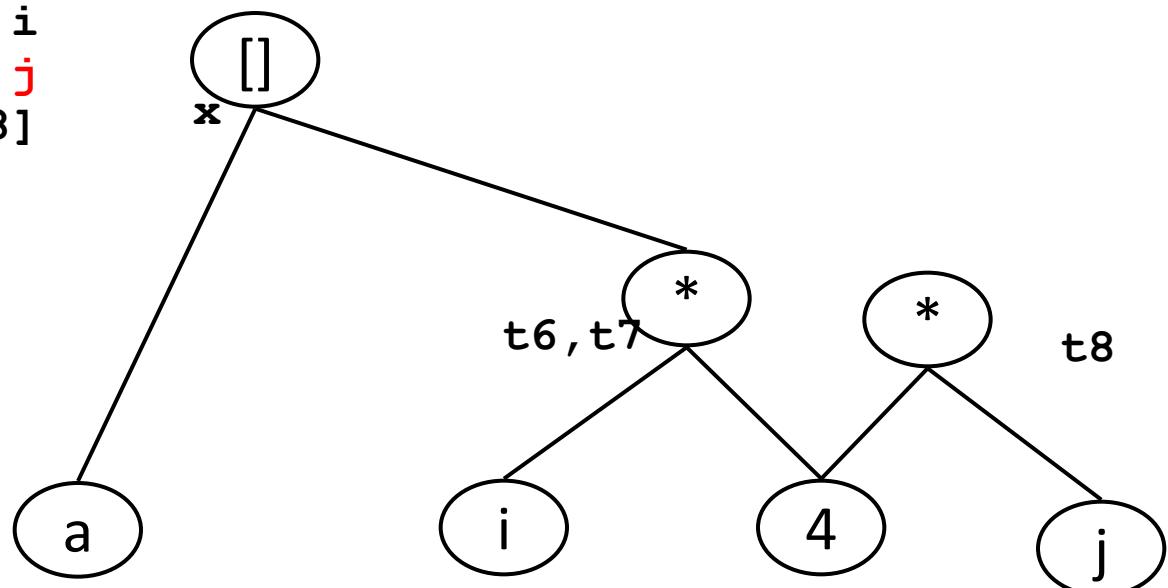
```
B5: t6      = 4*i  
      x      = a[t6]  
      t7    = 4 * i  
      t8      = 4 * j  
      t9      = a[t8]  
      a[t7]  = t9  
      t10     = 4*j  
      a[t10] = x  
      jump   B2
```

- If you have seen all rvalues before see if an interior node with same “op” and operands has already been created. If so, add a label.



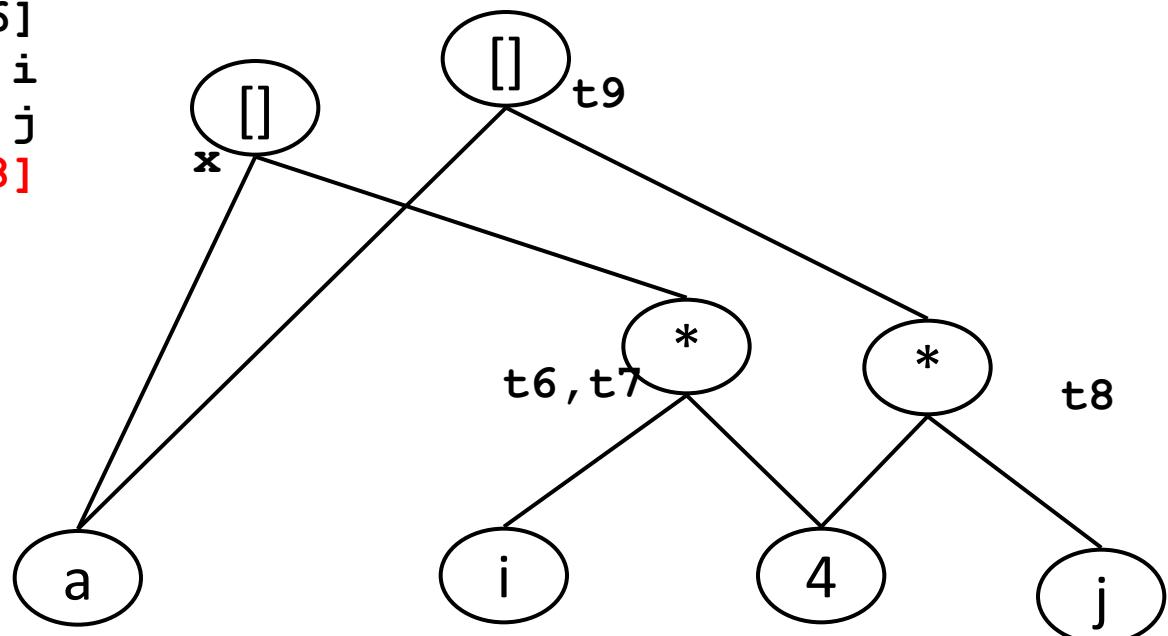
Build a DAG

```
B5: t6      = 4*i  
      x      = a[t6]  
      t7      = 4 * i  
t8      = 4 * j  
      t9      = a[t8]  
      a[t7]   = t9  
      t10     = 4*j  
      a[t10]  = x  
      jump    B2
```



Build a DAG

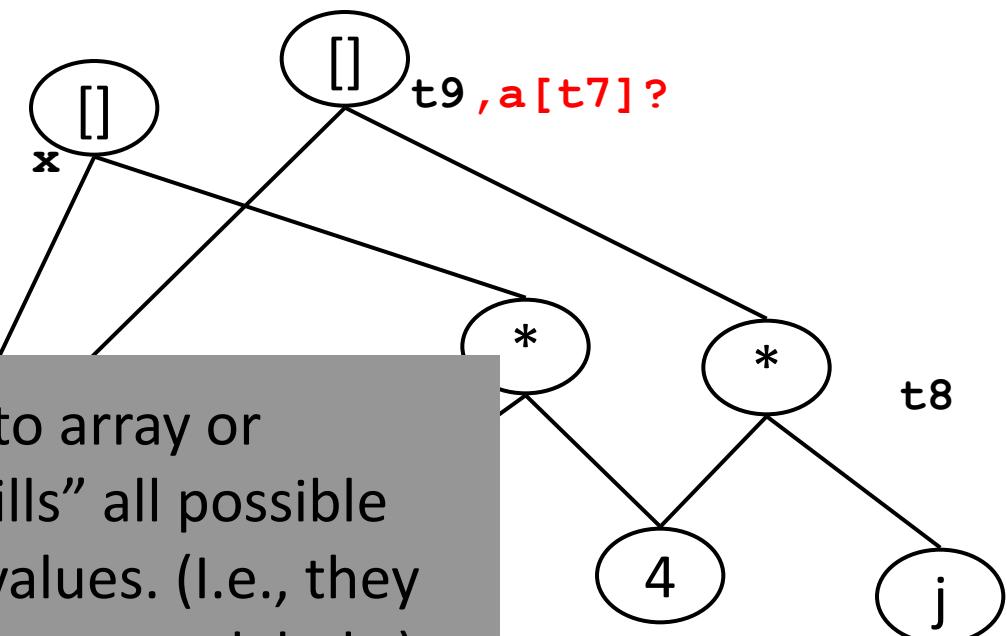
```
B5: t6      = 4*i  
      x      = a[t6]  
      t7      = 4 * i  
      t8      = 4 * j  
t9      = a[t8]  
a[t7]    = t9  
t10     = 4*j  
a[t10]   = x  
jump    B2
```



Build a DAG

```
B5: t6      = 4*i  
      x      = a[t6]  
      t7      = 4 * i  
      t8      = 4 * j  
      t9      = a[t8]  
a[t7] = t9  
      t10     = 4*j  
      a[t10] = x  
      jump
```

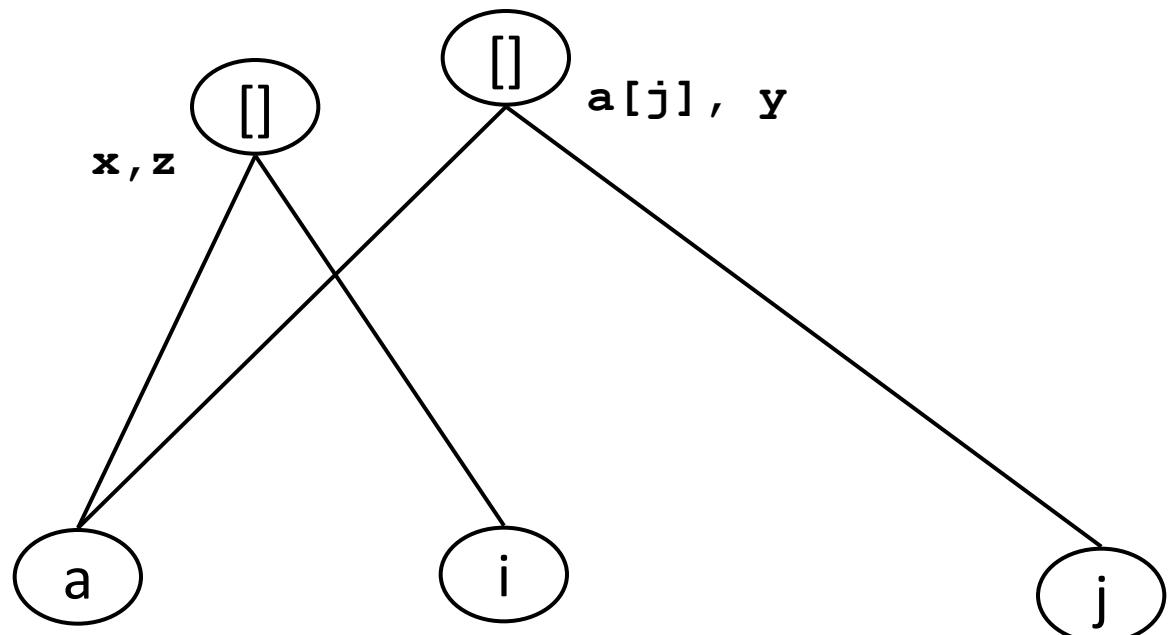
- Assigning to array or pointer “kills” all possible memory lvalues. (I.e., they can’t get any more labels.)



Memory References

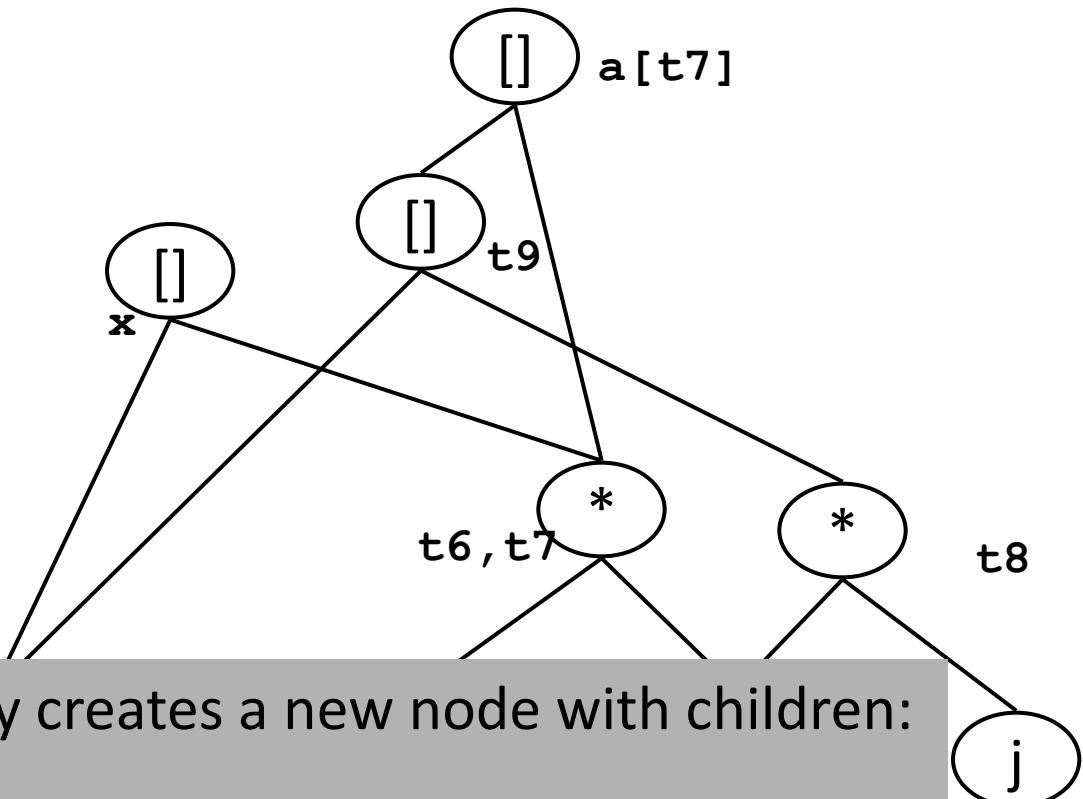
```
x = a[i]
a[j] = y
z = a[i]
```

Becomes:

~~```
x = a[i]
z = x
a[j] = y
```~~

# Build a DAG

```
B5: t6 = 4*i
 x = a[t6]
 t7 = 4 * i
 t8 = 4 * j
 t9 = a[t8]
 a[t7] = t9
 t10 = 4*j
 a[t10] = x
 jump B2
```

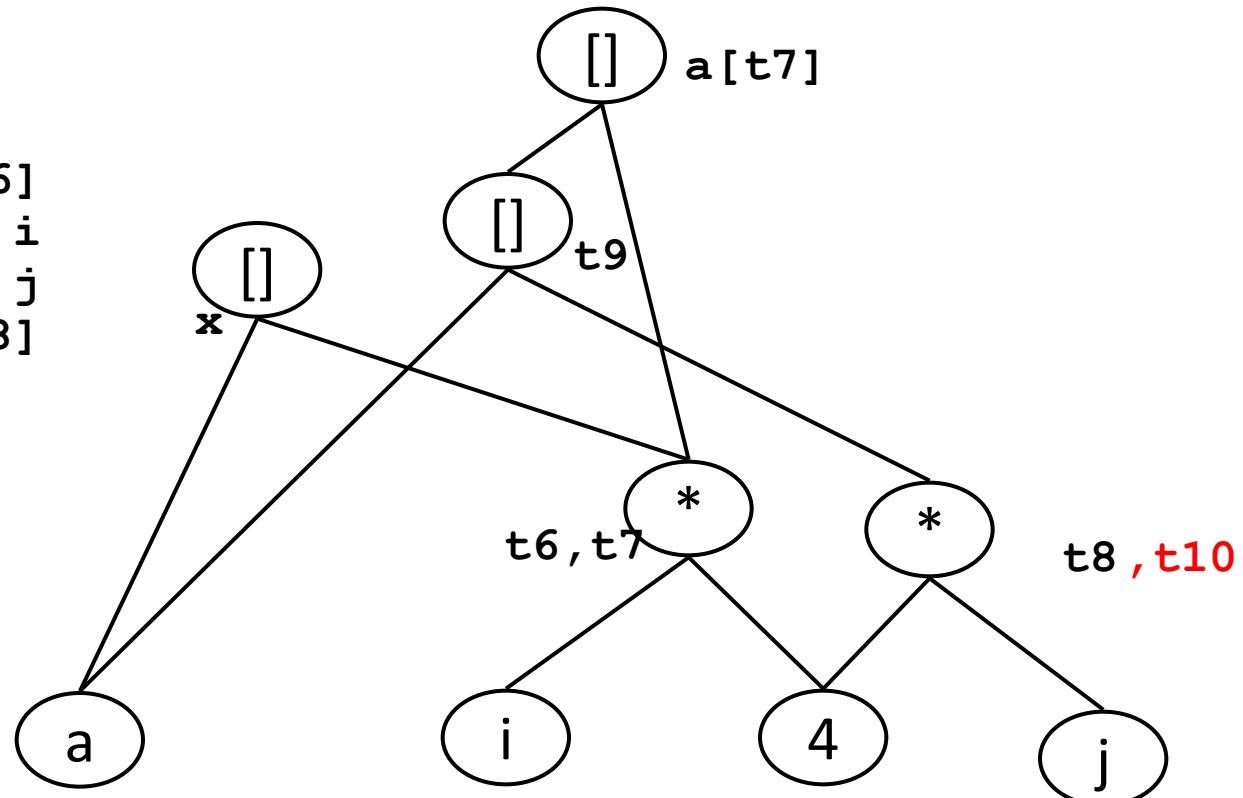


Assignment to an array creates a new node with children:

- index
- old value of array
- value assigned

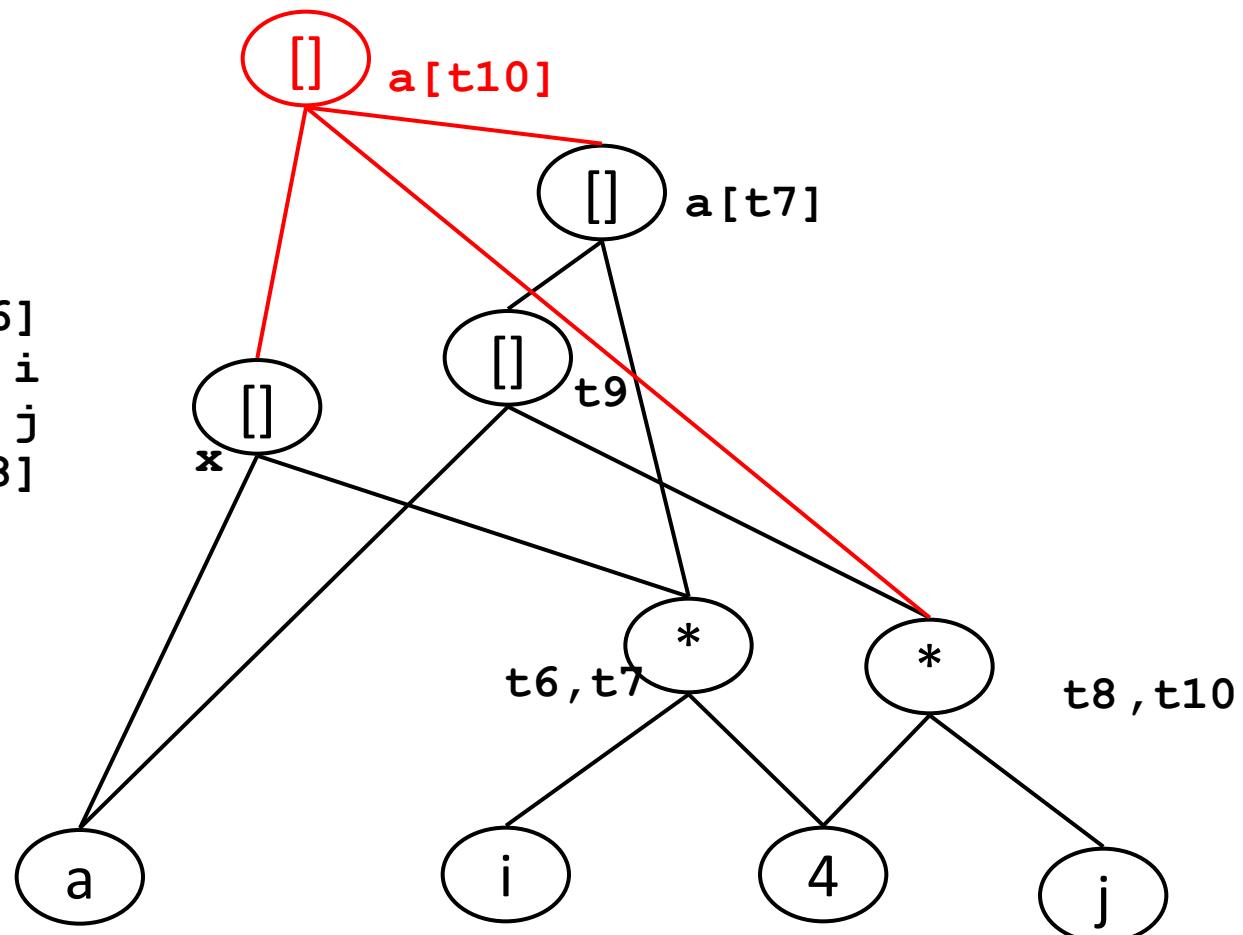
# Build a DAG

```
B5: t6 = 4*i
 x = a[t6]
 t7 = 4 * i
 t8 = 4 * j
 t9 = a[t8]
 a[t7] = t9
t10 = 4*j
 a[t10] = x
 jump B2
```



# Build a DAG

```
B5: t6 = 4*i
 x = a[t6]
 t7 = 4 * i
 t8 = 4 * j
 t9 = a[t8]
 a[t7] = t9
 t10 = 4*j
a[t10] = x
jump B2
```



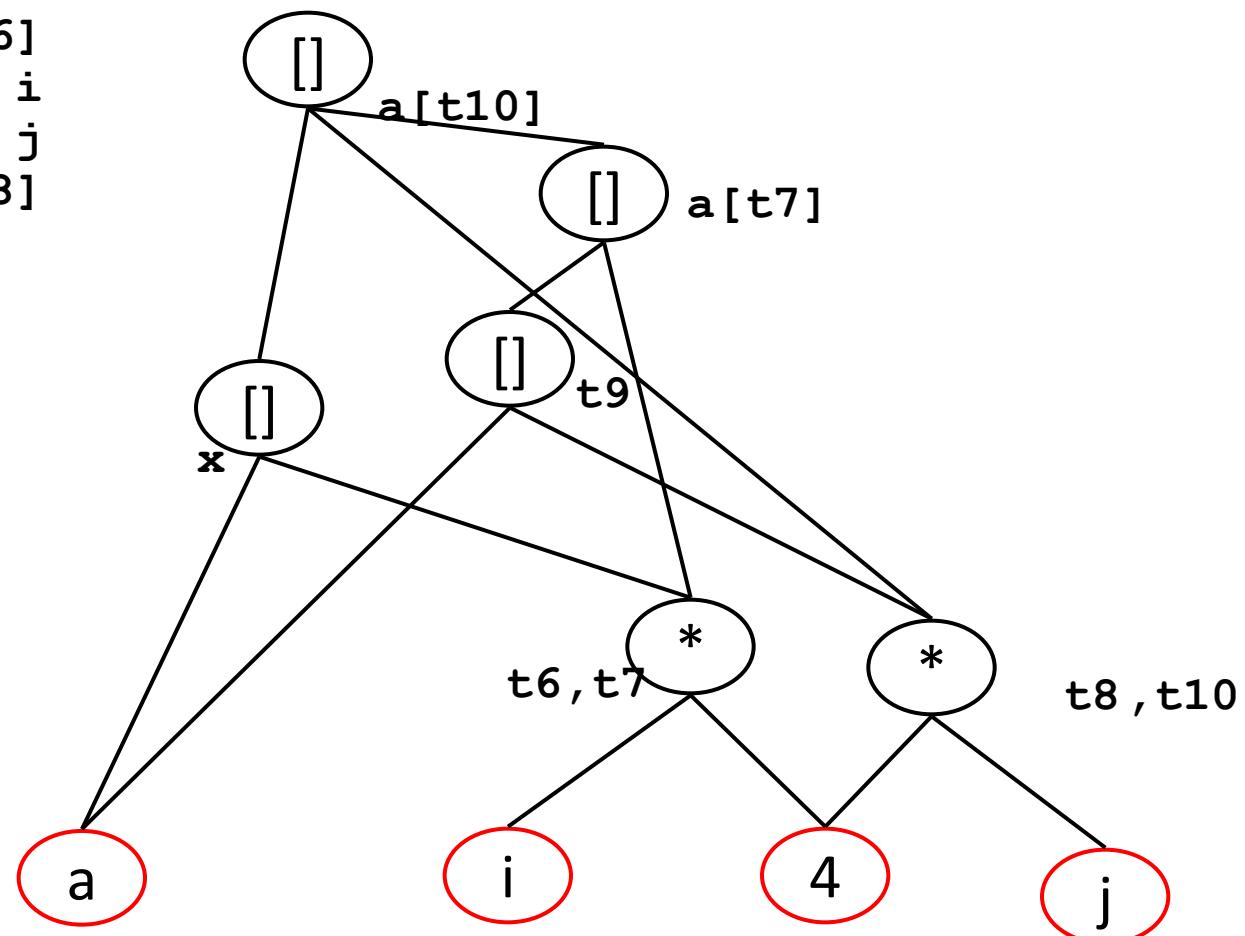
# Using the DAG to recreate blocks

- Order of evaluation is any topological sort
- We pick a node. Assign it to ONE of the labels (hopefully one needed later in the program)
- If we end up with identifiers that are needed after this block, insert move statements.
- If a node has no identifiers, make up a new one.
- Caveats:
  - Procedure calls kill nodes
  - $A[]$  = and  $*p$  = kill nodes

Original

```
B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2
```

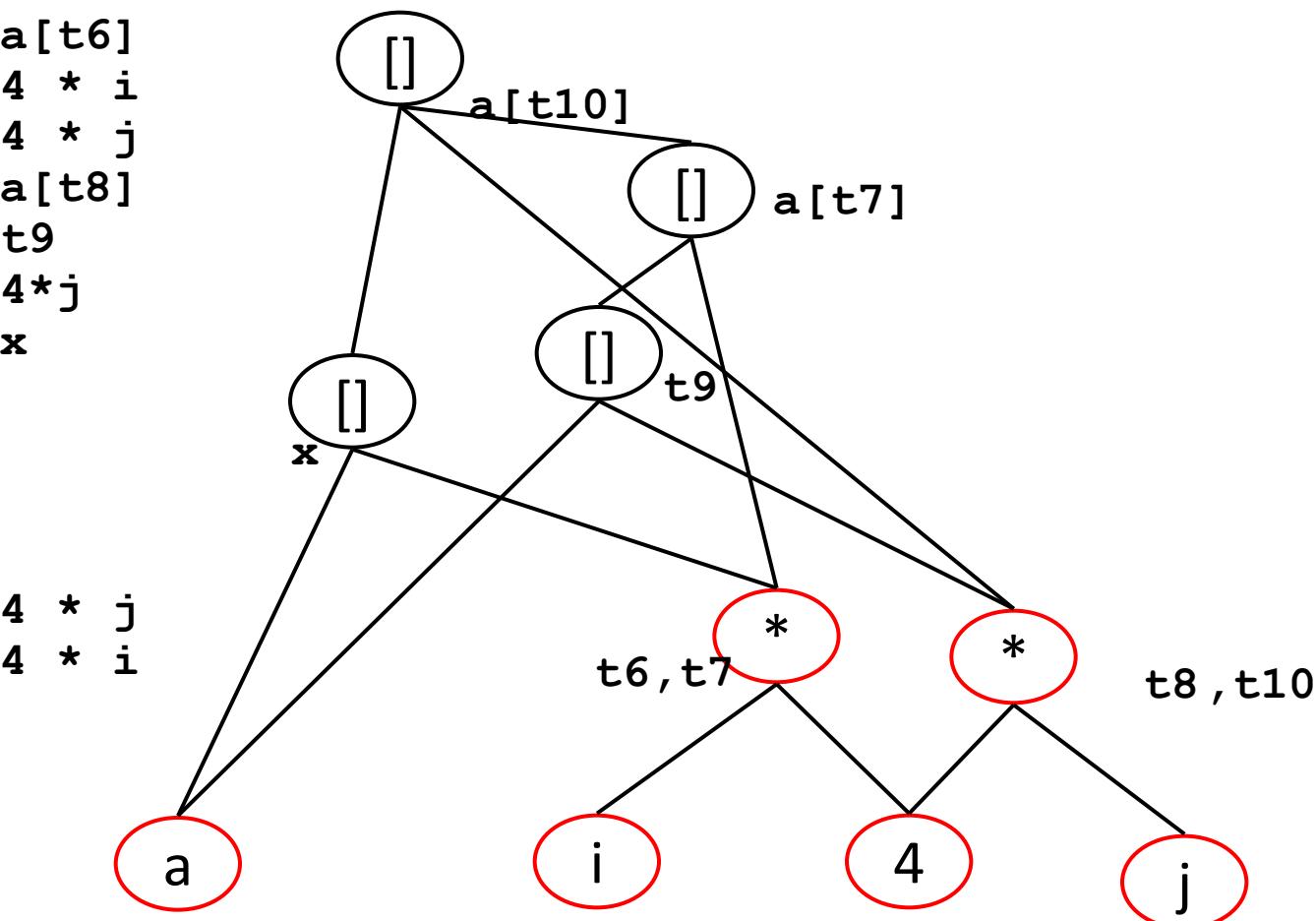
# Recreating the Code



Original

```
B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2
```

```
B5: t8 = 4 * j
t6 = 4 * i
```

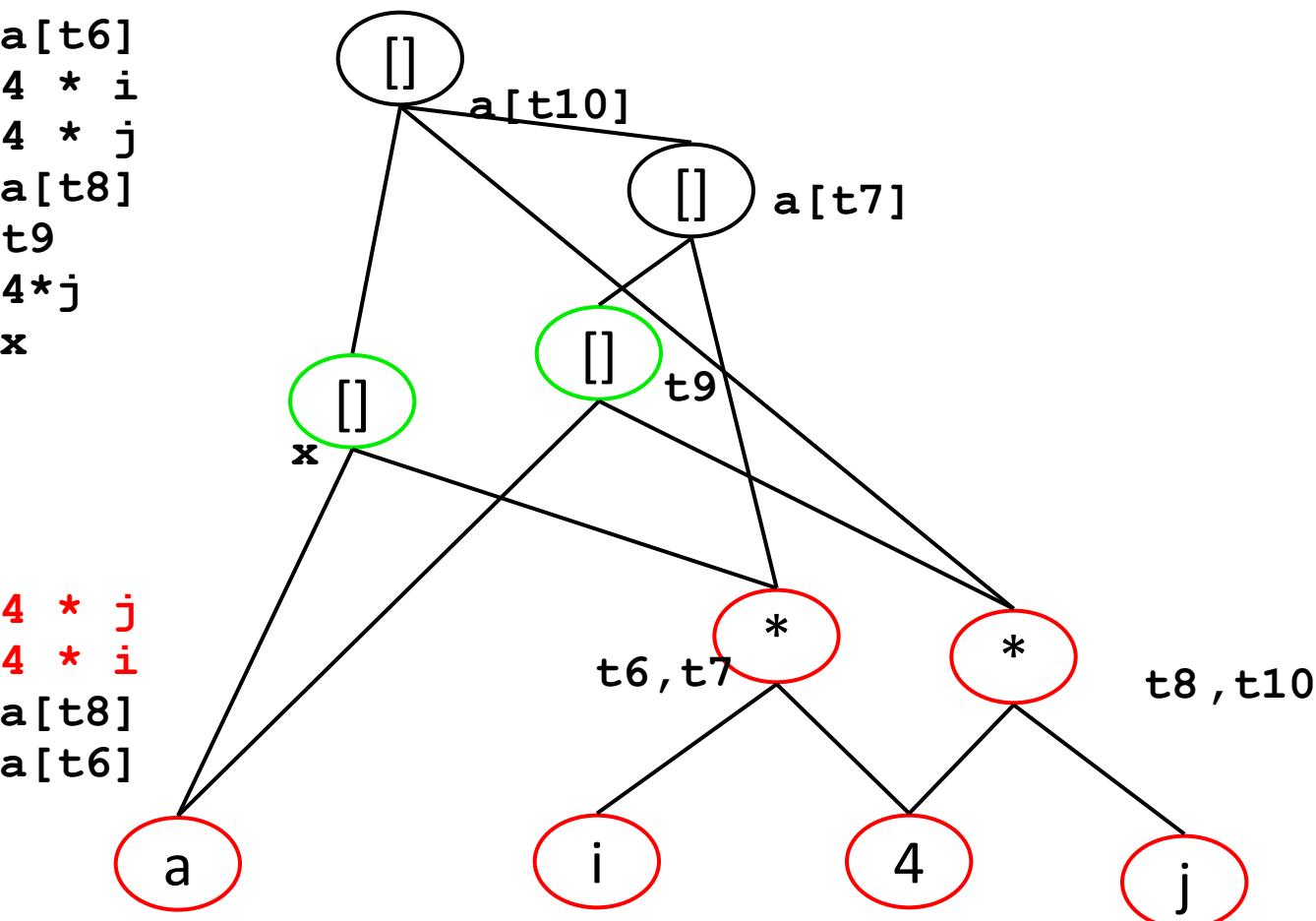


# Recreating the Code

Original

```
B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2
```

```
B5: t8 = 4 * j
t6 = 4 * i
t9 = a[t8]
x = a[t6]
```



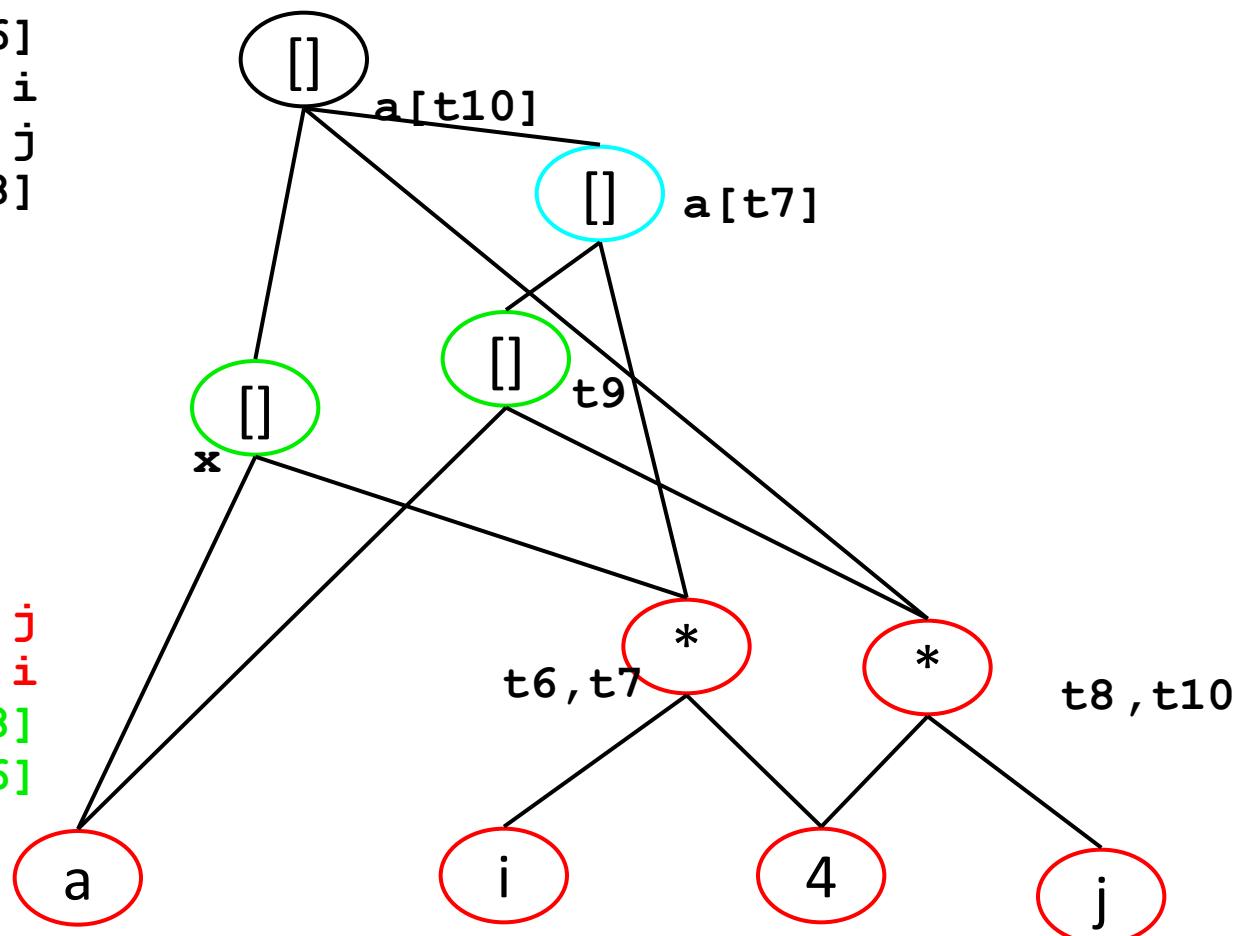
# Recreating the Code

Original

```
B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2
```

```
B5: t8 = 4 * j
t6 = 4 * i
t9 = a[t8]
x = a[t6]
a[t6] = t9
```

# Recreating the Code

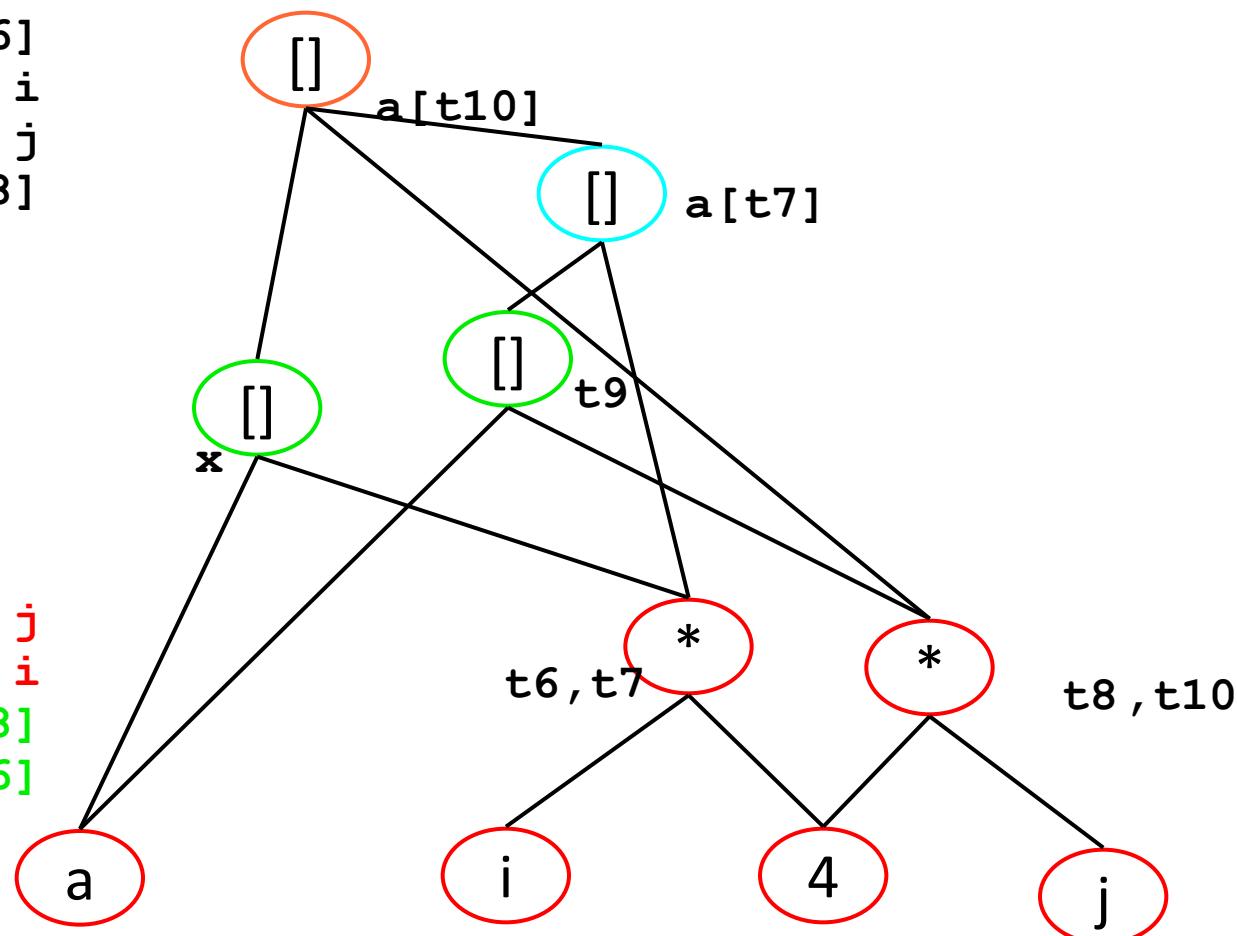


Original

```
B5: t6 = 4*i
x = a[t6]
t7 = 4 * i
t8 = 4 * j
t9 = a[t8]
a[t7] = t9
t10 = 4*j
a[t10] = x
jump B2
```

```
B5: t8 = 4 * j
t6 = 4 * i
t9 = a[t8]
x = a[t6]
a[t6] = t9
a[t8] = x
```

# Recreating the Code

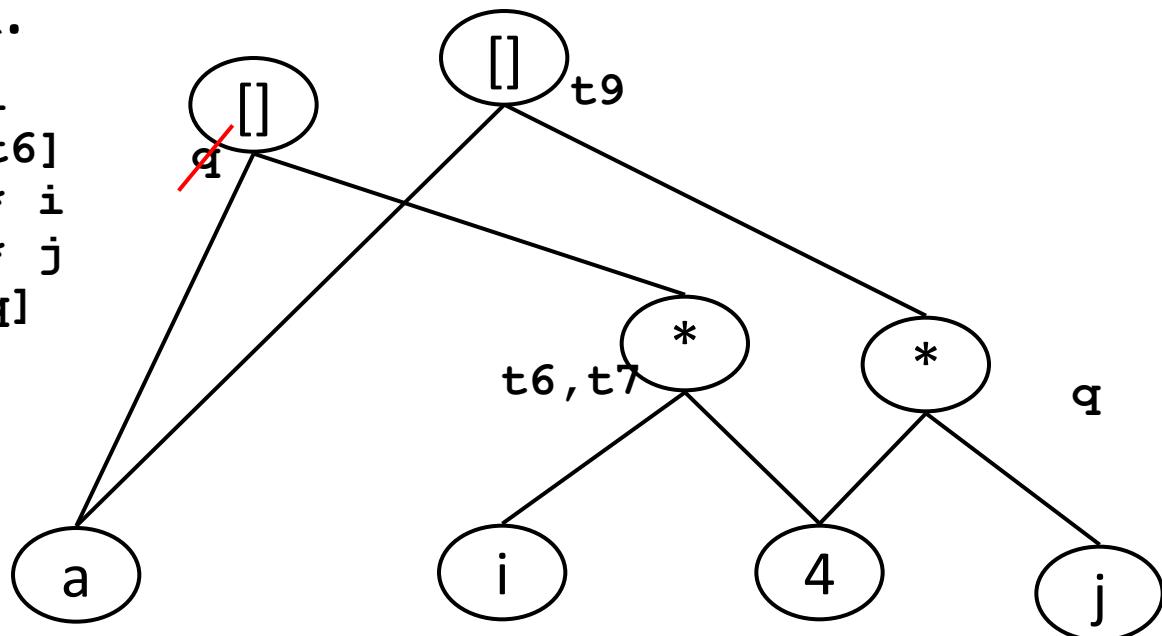


# Other uses for DAGs

- Can determine those variables that *can* be live at end of a block.
- Can determine those variables that are live at start of block.

```
B8: t6 = 4*i
 q = a[t6]
 t7 = 4 * i
 q = 4 * j
 t9 = a[q]
...

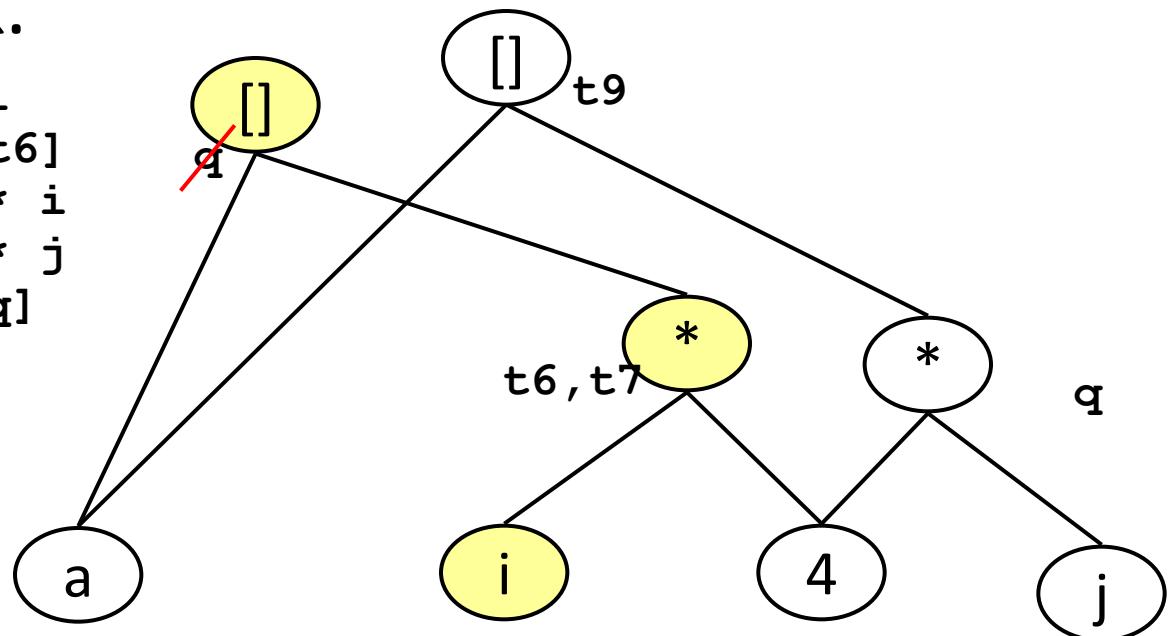
```



# Dead code too?

- Can determine those variables that *can* be live at end of a block.
- Can determine those variables that are live at start of block.

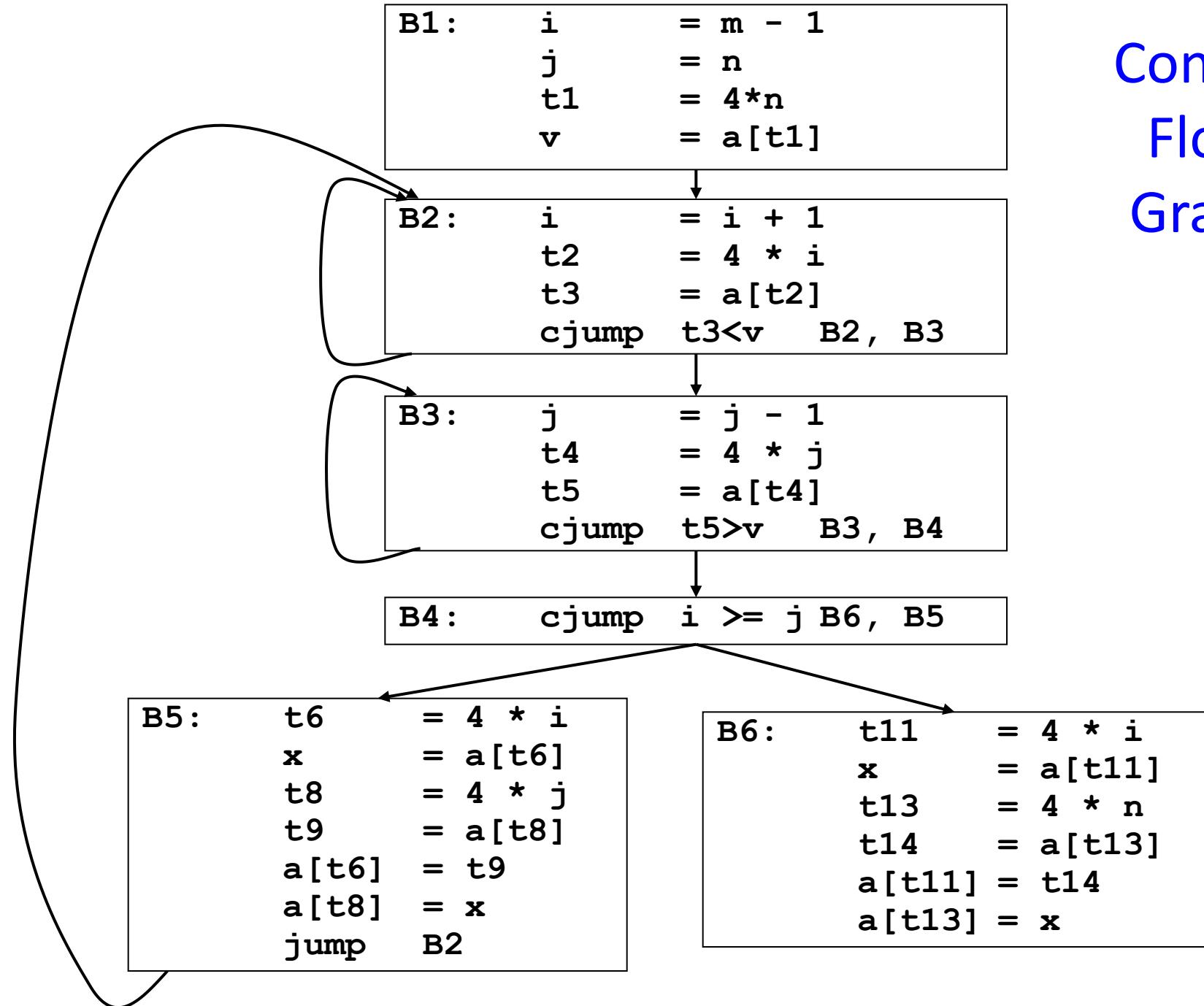
```
B8: t6 = 4*i
 q = a[t6]
 t7 = 4 * i
 q = 4 * j
 t9 = a[q]
...
 ...
```



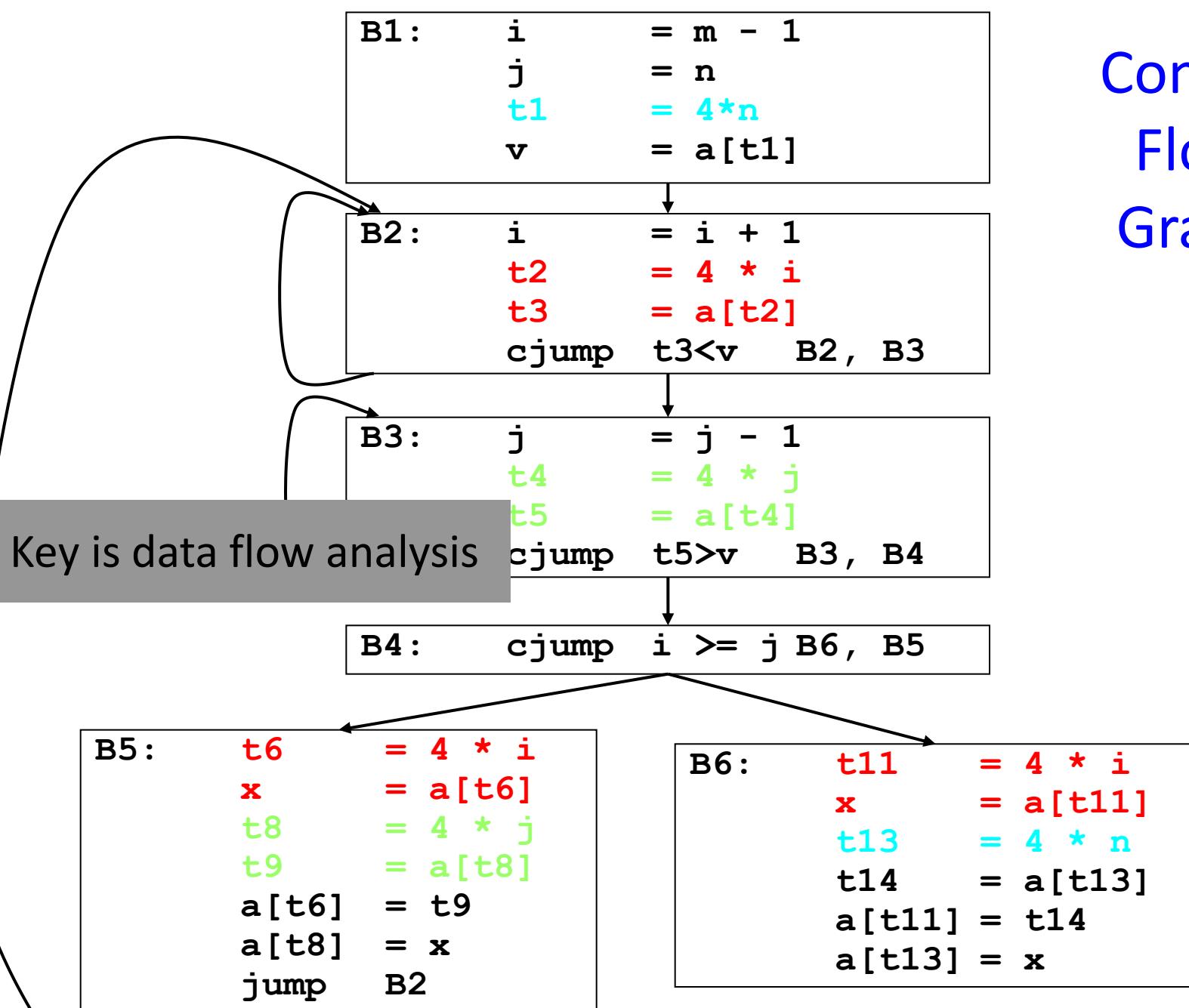
# Can we do better?

|     |                     |     |              |
|-----|---------------------|-----|--------------|
| B1: | i = m - 1           | B5: | t6 = 4 * i   |
|     | j = n               |     | x = a[t6]    |
|     | t1 = 4*n            |     |              |
|     | v = a[t1]           |     | t8 = 4 * j   |
| B2: | i = i + 1           |     | t9 = a[t8]   |
|     | t2 = 4 * i          |     | a[t6] = t9   |
|     | t3 = a[t2]          |     |              |
|     | cjump t3 < v B2, B3 |     | a[t8] = x    |
|     |                     |     | jump B2      |
| B3: | j = j - 1           | B6: | t11 = 4 * i  |
|     | t4 = 4 * j          |     | x = a[t11]   |
|     | t5 = a[t4]          |     |              |
|     | cjump t5 > v B3, B4 |     | t13 = 4 * n  |
| B4: | cjump i >= j B6, B5 |     | t14 = a[t13] |
|     |                     |     | a[t11] = t14 |
|     |                     |     | a[t13] = x   |

# Control Flow Graph



# Control Flow Graph



B1:      i            = m - 1  
              j            = n  
              t1           = 4\*n  
              v            = a[t1]

B2:      i            = i + 1  
              t2           = 4 \* i  
              t3           = a[t2]  
              cjump      t3 < v      B2 , B3

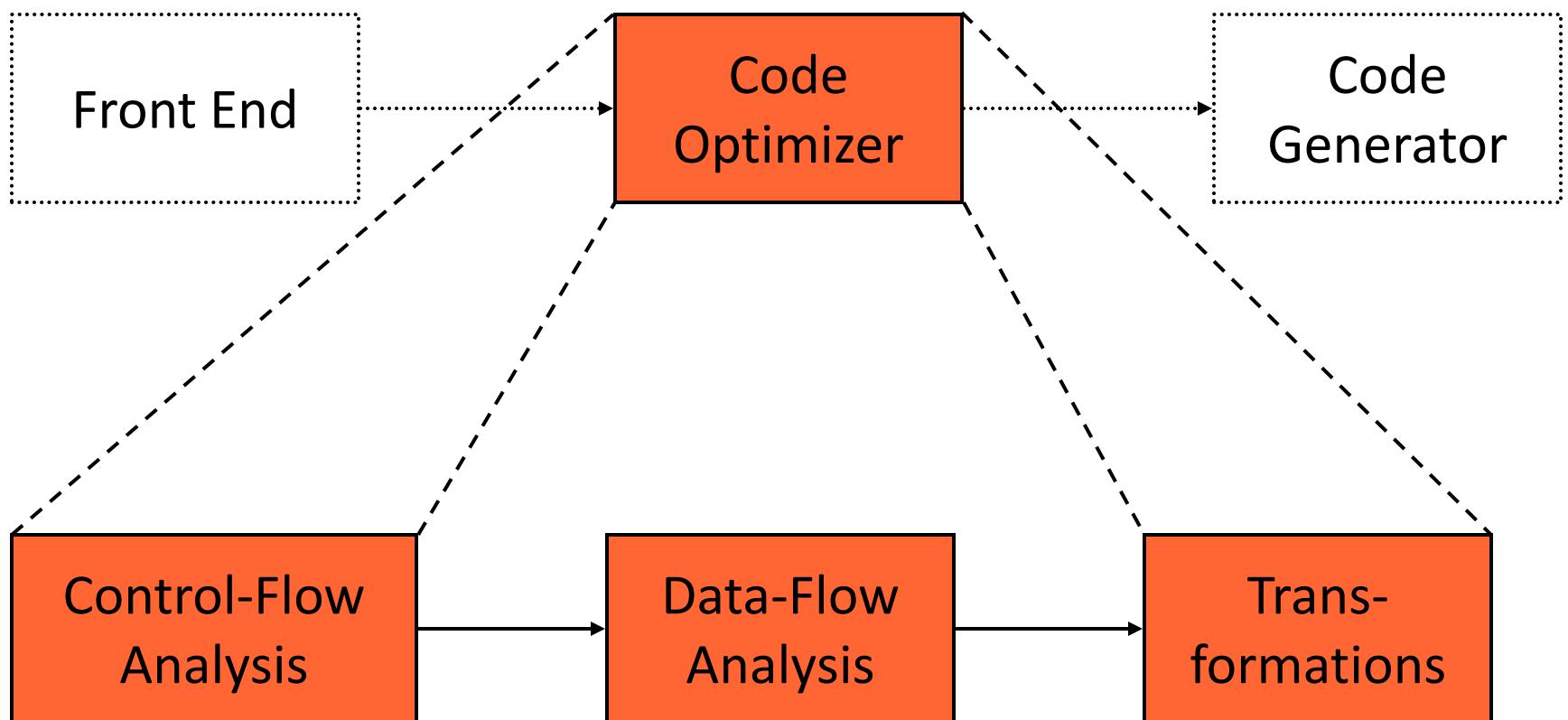
B3:      j            = j - 1  
              t4           = 4 \* j  
              t5           = a[t4]  
              cjump      t5 > v      B3 , B4

B4:      cjump      i >= j      B6 , B5

B5:      x            = t3  
              a[t2]      = t5  
              a[t4]      = x  
              jump       B2

B6:      x            = t3  
              t14          = a[t1]  
              a[t2]      = t14  
              a[t1]      = x

# The Optimizer



# Optimizations

- Register Allocation
  - Liveness or reaching definitions
- Common subexpression elimination
  - Available expressions and reaching expressions
- Constant Propagation
- Copy propagation
- Dead-code elimination
- Loop optimizations
  - Hoisting
  - Induction variable elimination

# Dataflow Analysis

- Goal:
  - Answers: Is it **legal** to perform an optimization?
  - (Not answering: “it is **beneficial**?”)
- A framework for proving facts about program
- Reasons about lots of little facts
- Little or no interaction between facts
  - Works best on properties about how program computes
- Based on all paths through program
  - including infeasible paths

# Today

- Dataflow Analysis
  - reaching definitions
  - liveness
  - available expressions
  - very busy expressions
- Framework

# A sample program

```
int fib10(void) {
 int n = 10; 1: n <- 10
 int older = 0; 2: older <- 0
 int old = 1; 3: old <- 1
 int result = 0; 4: result <- 0
 int i; 5: if n <= 1 goto 14
 if (n <= 1) return n; 6: i <- 2
 for (i = 2; i<n; i++) {
 result = old + older; 8: result <- old + older
 older = old; 9: older <- old
 old = result; 10: old <- result
 } 11: i <- i + 1
 return result; 12: JUMP 7
} 13: return result
 14: return n
```

# Simple Constant Propagation

- Can we do SCP?

1:    `n <- 10`

2:    `older <- 0`

- How do we recognize it?

3:    `old <- 1`

4:    `result <- 0`

5:    `if n <= 1 goto 14`

- What aren't we doing?

6:    `i <- 2`

7:    `if i > n goto 13`

- Metanote:

- keep opts simple!

8:    `result <- old + older`

9:    `older <- old`

10:   `old <- result`

11:   `i <- i + 1`

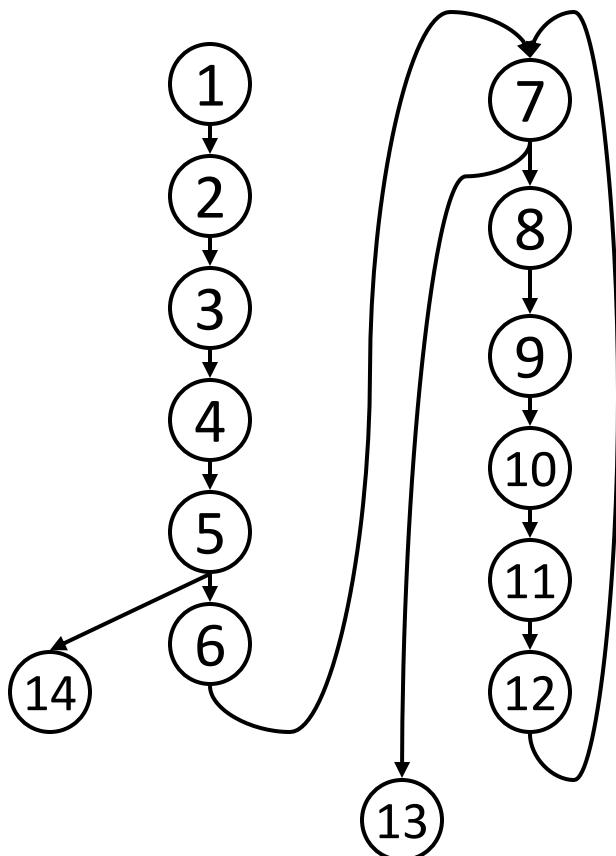
12:   `JUMP 7`

13:   `return result`

14:   `return n`

# Reaching Definitions

A definition of variable *v* at program point *d* reaches program point *u* if there exists a path of control flow edges from *d* to *u* that does not contain a definition of *v*.



```
1: n <- 10
2: older <- 0
3: old <- 1
4: result <- 0
5: if n <= 1 goto 14
6: i <- 2
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

# Reaching Definitions (ex)

- 1 reaches 5, 7, and 14

14, Really?

Meta-notes:

- (almost) always conservative
- only know what we know
- Keep it simple:
  - What opt(s), if run before this would help
  - What about:
    - 1: **x** <- 0
    - 2: **if (false)** **x<-1**
    - 3: ... **x** ...
      - Does 1 reach 3?
      - What opt changes this?

```
1: n <- 10
2: older <- 0
3: old <- 1
4: result <- 0
5: if n <= 1 goto 14
6: i <- 2
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

# Calculating Reaching Definitions

A definition of variable  $v$  at program point  $d$  reaches program point  $u$  if there exists a path of control flow edges from  $d$  to  $u$  that does not contain a definition of  $v$ .

- Build up RD stmt by stmt
- Stmt  $s$ , “ $d: v \leftarrow x \text{ op } y$ ”, generates  $d$
- Stmt  $s$ , “ $d: v \leftarrow x \text{ op } y$ ”, kills all other  $\text{defs}(v)$

Or,

- $\text{Gen}[s] = \{ d \}$
- $\text{Kill}[s] = \text{defs}(v) - \{ d \}$

# Gen and kill for each stmt

|     |                       | Gen | kill |
|-----|-----------------------|-----|------|
| 1:  | n <- 10               | 1   |      |
| 2:  | older <- 0            | 2   | 9    |
| 3:  | old <- 1              | 3   | 10   |
| 4:  | result <- 0           | 4   | 8    |
| 5:  | if n <= 1 goto 14     |     |      |
| 6:  | i <- 2                | 6   | 11   |
| 7:  | if i > n goto 13      |     |      |
| 8:  | result <- old + older | 8   | 4    |
| 9:  | older <- old          | 9   | 2    |
| 10: | old <- result         | 10  | 3    |
| 11: | i <- i + 1            | 11  | 6    |
| 12: | JUMP 7                |     |      |
| 13: | return result         |     |      |
| 14: | return n              |     |      |

we determine the defs that reach a node by using:

- control flow information
- gen and kill info

# Computing in[n] and out[n]

- In[n]: the set of defs that reach the beginning of node n
- Out[n]: the set of defs that reach the end of node n

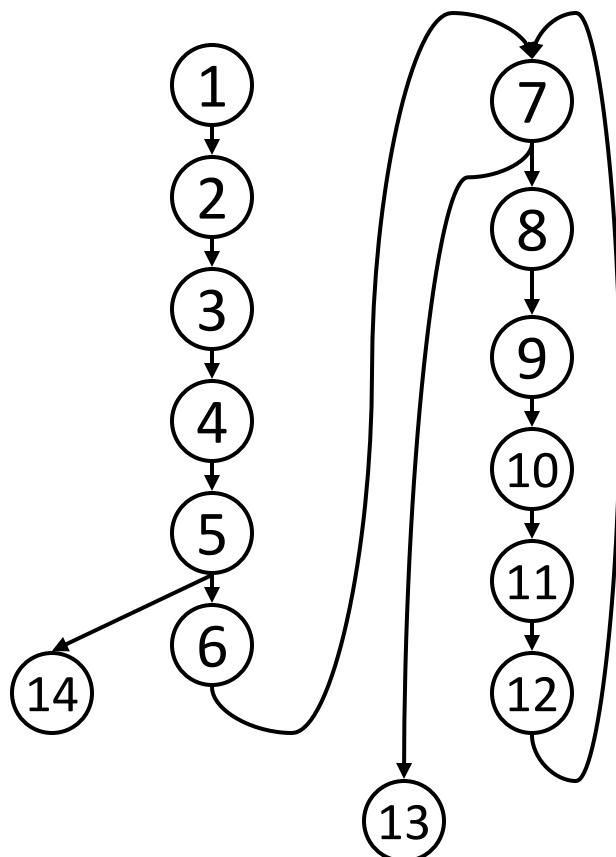
$$\text{in}[n] = \bigcup_{p \in \text{pred}[n]} \text{out}[p]$$

$$\text{out}[n] = \text{gen}[n] \cup (\text{in}[n] - \text{kill}[n])$$

- Initialize  $\text{in}[n]=\text{out}[n]=\{\}$  for all n
- Solve iteratively

# pred[n]?

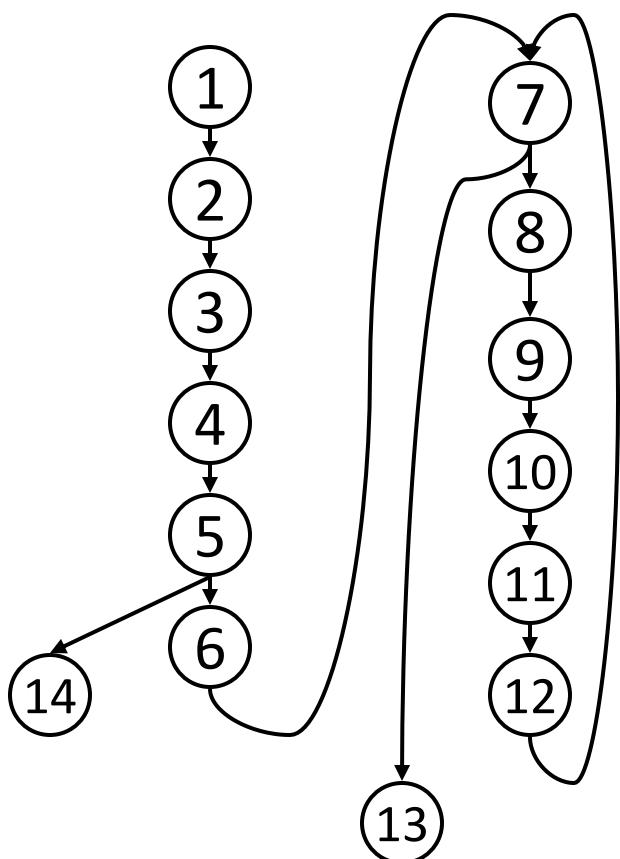
- Pred[n] are all nodes that can directly reach n in the control flow graph.
- E.g., pred[7] = { 6, 12 }



```
1: n <- 10
2: older <- 0
3: old <- 1
4: result <- 0
5: if n <= 1 goto 14
6: i <- 2
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

# What order to eval nodes?

- Does it matter?
- Lets do: 1,2,3,4,5,14,6,7,13,8,9,10,11,12



```
1: n <- 10
2: older <- 0
3: old <- 1
4: result <- 0
5: if n <= 1 goto 14
6: i <- 2
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

# Example:

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in | out |
|--------------------------|-----|------|----|-----|
| 1: n <- 10               | 1   |      |    | 1   |
| 2: older <- 0            | 2   | 9    |    |     |
| 3: old <- 1              | 3   | 10   |    |     |
| 4: result <- 0           | 4   | 8    |    |     |
| 5: if n <= 1 goto 14     |     |      |    |     |
| 6: i <- 2                | 6   | 11   |    |     |
| 7: if i > n goto 13      |     |      |    |     |
| 8: result <- old + older | 8   | 4    |    |     |
| 9: older <- old          | 9   | 2    |    |     |
| 10: old <- result        | 10  | 3    |    |     |
| 11: i <- i + 1           | 11  | 6    |    |     |
| 12: JUMP 7               |     |      |    |     |
| 13: return result        |     |      |    |     |
| 14: return n             |     |      |    |     |

# Example:

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in | out |
|--------------------------|-----|------|----|-----|
| 1: n <- 10               | 1   |      |    | 1   |
| 2: older <- 0            | 2   | 9    | 1  | 1,2 |
| 3: old <- 1              | 3   | 10   |    |     |
| 4: result <- 0           | 4   | 8    |    |     |
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| 13: return result        |     |      |    |     |
| 14: return n             |     |      |    |     |

# Example:

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

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| 3: old <- 1              | 3   | 10   | 1,2 | 1,2,3 |
| 4: result <- 0           | 4   | 8    |     |       |
| 5: if n <= 1 goto 14     |     |      |     |       |
| 6: i <- 2                | 6   | 11   |     |       |
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| 7: if i > n goto 13      |     |      | 1-4,6 | 1-4,6   |
| 8: result <- old + older | 8   | 4    | 1-4,6 | 1-3,6,8 |
| 9: older <- old          | 9   | 2    |       |         |
| 10: old <- result        | 10  | 3    |       |         |
| 11: i <- i + 1           | 11  | 6    |       |         |
| 12: JUMP 7               |     |      |       |         |
| 13: return result        |     |      | 1-4,6 | 1-4,6   |
| 14: return n             |     |      | 1-4   | 1-4     |

# Example (pass 1)

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| 4: result <- 0           |  | 4   | 8    | 1-3     | 1-4       |
| 5: if n <= 1 goto 14     |  |     |      | 1-4     | 1-4       |
| 6: i <- 2                |  | 6   | 11   | 1-4     | 1-4,6     |
| 7: if i > n goto 13      |  |     |      | 1-4,6   | 1-4,6     |
| 8: result <- old + older |  | 8   | 4    | 1-4,6   | 1-3,6,8   |
| 9: older <- old          |  | 9   | 2    | 1-3,6,8 | 1,3,6,8,9 |
| 10: old <- result        |  | 10  | 3    |         |           |
| 11: i <- i + 1           |  | 11  | 6    |         |           |
| 12: JUMP 7               |  |     |      |         |           |
| 13: return result        |  |     |      | 1-4,6   | 1-4,6     |
| 14: return n             |  |     |      | 1-4     | 1-4       |

# Example (pass 1)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

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|                          |  | Gen | kill | in        | out       |
|--------------------------|--|-----|------|-----------|-----------|
| 1: n <- 10               |  | 1   |      |           | 1         |
| 2: older <- 0            |  | 2   | 9    | 1         | 1,2       |
| 3: old <- 1              |  | 3   | 10   | 1,2       | 1,2,3     |
| 4: result <- 0           |  | 4   | 8    | 1-3       | 1-4       |
| 5: if n <= 1 goto 14     |  |     |      | 1-4       | 1-4       |
| 6: i <- 2                |  | 6   | 11   | 1-4       | 1-4,6     |
| 7: if i > n goto 13      |  |     |      | 1-4,6     | 1-4,6     |
| 8: result <- old + older |  | 8   | 4    | 1-4,6     | 1-3,6,8   |
| 9: older <- old          |  | 9   | 2    | 1-3,6,8   | 1,3,6,8,9 |
| 10: old <- result        |  | 10  | 3    | 1,3,6,8,9 | 1,6,8-10  |
| 11: i <- i + 1           |  | 11  | 6    |           |           |
| 12: JUMP 7               |  |     |      |           |           |
| 13: return result        |  |     |      | 1-4,6     | 1-4,6     |
| 14: return n             |  |     |      | 1-4       | 1-4       |

# Example (pass 1)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in        | out       |
|--------------------------|-----|------|-----------|-----------|
| 1: n <- 10               | 1   |      |           | 1         |
| 2: older <- 0            | 2   | 9    | 1         | 1,2       |
| 3: old <- 1              | 3   | 10   | 1,2       | 1,2,3     |
| 4: result <- 0           | 4   | 8    | 1-3       | 1-4       |
| 5: if n <= 1 goto 14     |     |      | 1-4       | 1-4       |
| 6: i <- 2                | 6   | 11   | 1-4       | 1-4,6     |
| 7: if i > n goto 13      |     |      | 1-4,6     | 1-4,6     |
| 8: result <- old + older | 8   | 4    | 1-4,6     | 1-3,6,8   |
| 9: older <- old          | 9   | 2    | 1-3,6,8   | 1,3,6,8,9 |
| 10: old <- result        | 10  | 3    | 1,3,6,8,9 | 1,6,8-10  |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-10  | 1,8-11    |
| 12: JUMP 7               |     |      |           |           |
| 13: return result        |     |      | 1-4,6     | 1-4,6     |
| 14: return n             |     |      | 1-4       | 1-4       |

# Example (pass 1)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          |  | Gen | kill | in        | out       |
|--------------------------|--|-----|------|-----------|-----------|
| 1: n <- 10               |  | 1   |      |           | 1         |
| 2: older <- 0            |  | 2   | 9    | 1         | 1,2       |
| 3: old <- 1              |  | 3   | 10   | 1,2       | 1,2,3     |
| 4: result <- 0           |  | 4   | 8    | 1-3       | 1-4       |
| 5: if n <= 1 goto 14     |  |     |      | 1-4       | 1-4       |
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| 8: result <- old + older |  | 8   | 4    | 1-4,6     | 1-3,6,8   |
| 9: older <- old          |  | 9   | 2    | 1-3,6,8   | 1,3,6,8,9 |
| 10: old <- result        |  | 10  | 3    | 1,3,6,8,9 | 1,6,8-10  |
| 11: i <- i + 1           |  | 11  | 6    | 1,6,8-10  | 1,8-11    |
| 12: JUMP 7               |  |     |      | 1,8-11    | 1,8-11    |
| 13: return result        |  |     |      | 1-4,6     | 1-4,6     |
| 14: return n             |  |     |      | 1-4       | 1-4       |

# Example (pass 2)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in        | out       |
|--------------------------|-----|------|-----------|-----------|
| 1: n <- 10               | 1   |      |           | 1         |
| 2: older <- 0            | 2   | 9    | 1         | 1,2       |
| 3: old <- 1              | 3   | 10   | 1,2       | 1,2,3     |
| 4: result <- 0           | 4   | 8    | 1-3       | 1-4       |
| 5: if n <= 1 goto 14     |     |      | 1-4       | 1-4       |
| 6: i <- 2                | 6   | 11   | 1-4       | 1-4,6     |
| 7: if i > n goto 13      |     |      | 1-4,6     | 1-4,6     |
| 8: result <- old + older | 8   | 4    | 1-4,6     | 1-3,6,8   |
| 9: older <- old          | 9   | 2    | 1-3,6,8   | 1,3,6,8,9 |
| 10: old <- result        | 10  | 3    | 1,3,6,8,9 | 1,6,8-10  |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-10  | 1,8-11    |
| 12: JUMP 7               |     |      | 1,8-11    | 1,8-11    |
| 13: return result        |     |      | 1-4,6     | 1-4,6     |
| 14: return n             |     |      | 1-4       | 1-4       |

# Example (pass 2)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in        | out       |
|--------------------------|-----|------|-----------|-----------|
| 1: n <- 10               | 1   |      |           | 1         |
| 2: older <- 0            | 2   | 9    | 1         | 1,2       |
| 3: old <- 1              | 3   | 10   | 1,2       | 1,2,3     |
| 4: result <- 0           | 4   | 8    | 1-3       | 1-4       |
| 5: if n <= 1 goto 14     |     |      | 1-4       | 1-4       |
| 6: i <- 2                | 6   | 11   | 1-4       | 1-4,6     |
| 7: if i > n goto 13      |     |      | 1-4,6     | 1-4,6     |
| 8: result <- old + older | 8   | 4    | 1-4,6     | 1-3,6,8   |
| 9: older <- old          | 9   | 2    | 1-3,6,8   | 1,3,6,8,9 |
| 10: old <- result        | 10  | 3    | 1,3,6,8,9 | 1,6,8-10  |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-10  | 1,8-11    |
| 12: JUMP 7               |     |      | 1,8-11    | 1,8-11    |
| 13: return result        |     |      | 1-4,6     | 1-4,6     |
| 14: return n             |     |      | 1-4       | 1-4       |

# Example (pass 2)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in         | out        |
|--------------------------|-----|------|------------|------------|
| 1: n <- 10               | 1   |      |            | 1          |
| 2: older <- 0            | 2   | 9    | 1          | 1,2        |
| 3: old <- 1              | 3   | 10   | 1,2        | 1,2,3      |
| 4: result <- 0           | 4   | 8    | 1-3        | 1-4        |
| 5: if n <= 1 goto 14     |     |      | 1-4        | 1-4        |
| 6: i <- 2                | 6   | 11   | 1-4        | 1-4,6      |
| 7: if i > n goto 13      |     |      | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: result <- old + older | 8   | 4    | 1-4,6      | 1-3,6,8    |
| 9: older <- old          | 9   | 2    | 1-3,6,8    | 1,3,6,8,9  |
| 10: old <- result        | 10  | 3    | 1,3,6,8,9  | 1,6,8-10   |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-10   | 1,8-11     |
| 12: JUMP 7               |     |      | 1,8-11     | 1,8-11     |
| 13: return result        |     |      | 1-4,6      | 1-4,6      |
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```

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| 8: result <- old + older | 8   | 4    | 1-4,6      | 1-3,6,8    |
| 9: older <- old          | 9   | 2    | 1-3,6,8    | 1,3,6,8,9  |
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```

1: n <- 10
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| 7: if i > n goto 13      |     |      | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: result <- old + older | 8   | 4    | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 9   | 2    | 1-3,6,8    | 1,3,6,8,9  |
| 10: old <- result        | 10  | 3    | 1,3,6,8,9  | 1,6,8-10   |
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|--------------------------|-----|------|------------|------------|
| 1: n <- 10               | 1   |      |            | 1          |
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| 1: n <- 10               | 1   |      |            | 1          |
| 2: older <- 0            | 2   | 9    | 1          | 1,2        |
| 3: old <- 1              | 3   | 10   | 1,2        | 1,2,3      |
| 4: result <- 0           | 4   | 8    | 1-3        | 1-4        |
| 5: if n <= 1 goto 14     |     |      | 1-4        | 1-4        |
| 6: i <- 2                | 6   | 11   | 1-4        | 1-4,6      |
| 7: if i > n goto 13      |     |      | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: result <- old + older | 8   | 4    | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 9   | 2    | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: old <- result        | 10  | 3    | 1,3,6,8-11 | 1,6,8-11   |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-10   | 1,8-11     |
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# Example (pass 2)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

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|                          | Gen | kill | in         | out        |
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| 2: older <- 0            | 2   | 9    | 1          | 1,2        |
| 3: old <- 1              | 3   | 10   | 1,2        | 1,2,3      |
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| 8: result <- old + older | 8   | 4    | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 9   | 2    | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: old <- result        | 10  | 3    | 1,3,6,8-11 | 1,6,8-11   |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-11   | 1,8-11     |
| 12: JUMP 7               |     |      | 1,8-11     | 1,8-11     |
| 13: return result        |     |      | 1-4,6,8-11 | 1-4,6,8-11 |
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# Example (pass 2)

- Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p] \quad out[n] = gen[n] \cup (in[n] - kill[n])$$

|                          | Gen | kill | in         | out        |
|--------------------------|-----|------|------------|------------|
| 1: n <- 10               | 1   |      |            | 1          |
| 2: older <- 0            | 2   | 9    | 1          | 1,2        |
| 3: old <- 1              | 3   | 10   | 1,2        | 1,2,3      |
| 4: result <- 0           | 4   | 8    | 1-3        | 1-4        |
| 5: if n <= 1 goto 14     |     |      | 1-4        | 1-4        |
| 6: i <- 2                | 6   | 11   | 1-4        | 1-4,6      |
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| 8: result <- old + older | 8   | 4    | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 9   | 2    | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: old <- result        | 10  | 3    | 1,3,6,8-11 | 1,6,8-11   |
| 11: i <- i + 1           | 11  | 6    | 1,6,8-11   | 1,8-11     |
| 12: JUMP 7               |     |      | 1,8-11     | 1,8-11     |
| 13: return result        |     |      | 1-4,6,8-11 | 1-4,6,8-11 |
| 14: return n             |     |      | 1-4        | 1-4        |

# An Improvement: Basic Blocks

- No need to compute this one stmt at a time
- For straight line code:
  - $\text{In}[s_1; s_2] = \text{in}[s_1]$
  - $\text{Out}[s_1; s_2] = \text{out}[s_2]$
- Combine the gen and kill sets into one per BB.

|                     |                         | Gen | kill |
|---------------------|-------------------------|-----|------|
| • Gen[BB]={2,3,4,5} | 1: $i \leftarrow 1$     | 1   | 8, 4 |
|                     | 2: $j \leftarrow 2$     | 2   |      |
| • Kill[BB]={1,8,11} | 3: $k \leftarrow 3 + i$ | 3   | 11   |
|                     | 4: $i \leftarrow j$     | 4   | 1, 8 |
|                     | 5: $m \leftarrow i + k$ | 5   |      |

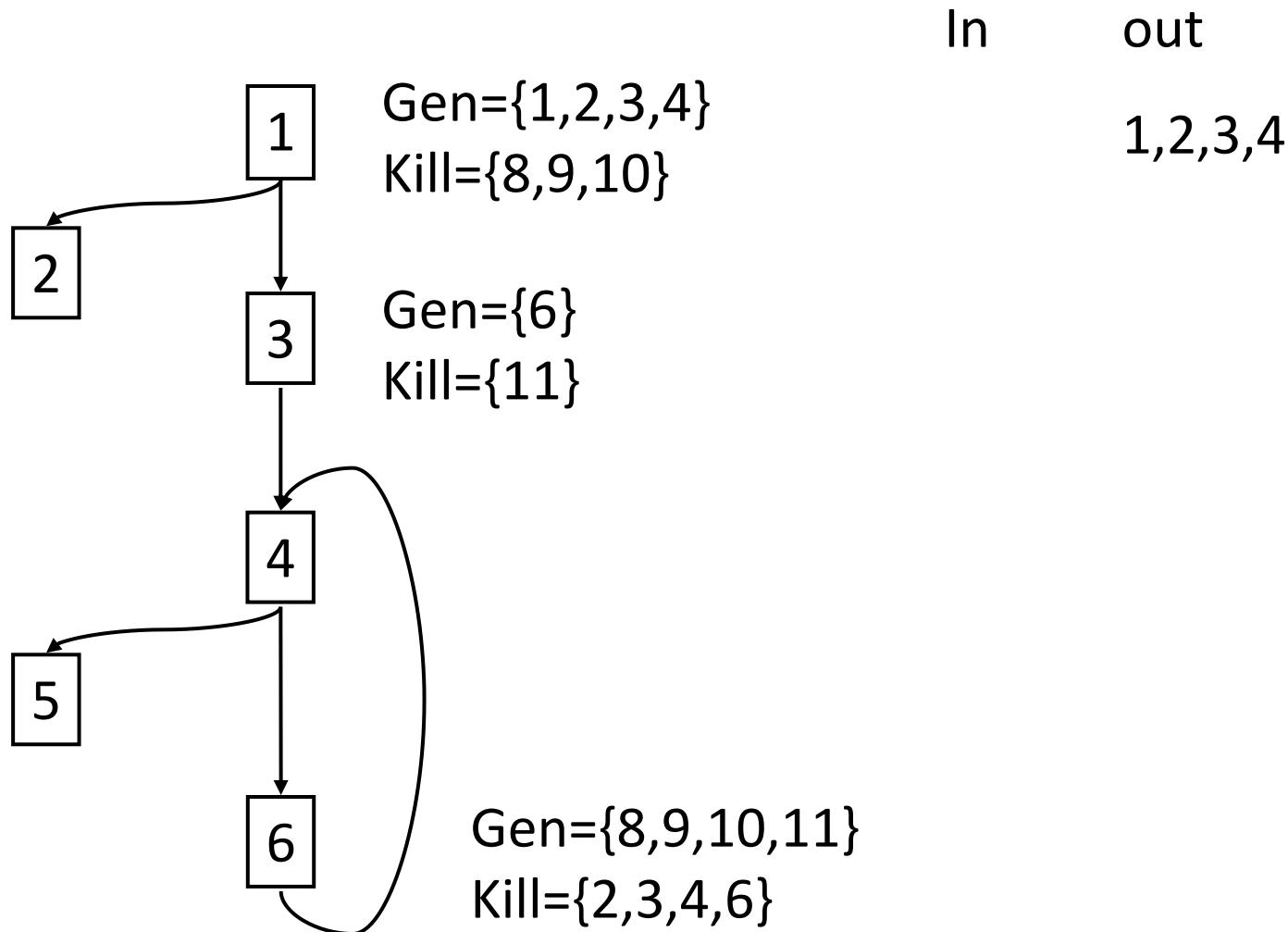
# General Procedure

- Create Basic Blocks
- Create Control Flow Graph
- Summarize Basic Block into a single Gen set and a single Kill set
- Iterate over CFG until no changes
- create data flow facts for individual instructions as needed starting with in set of the basic block

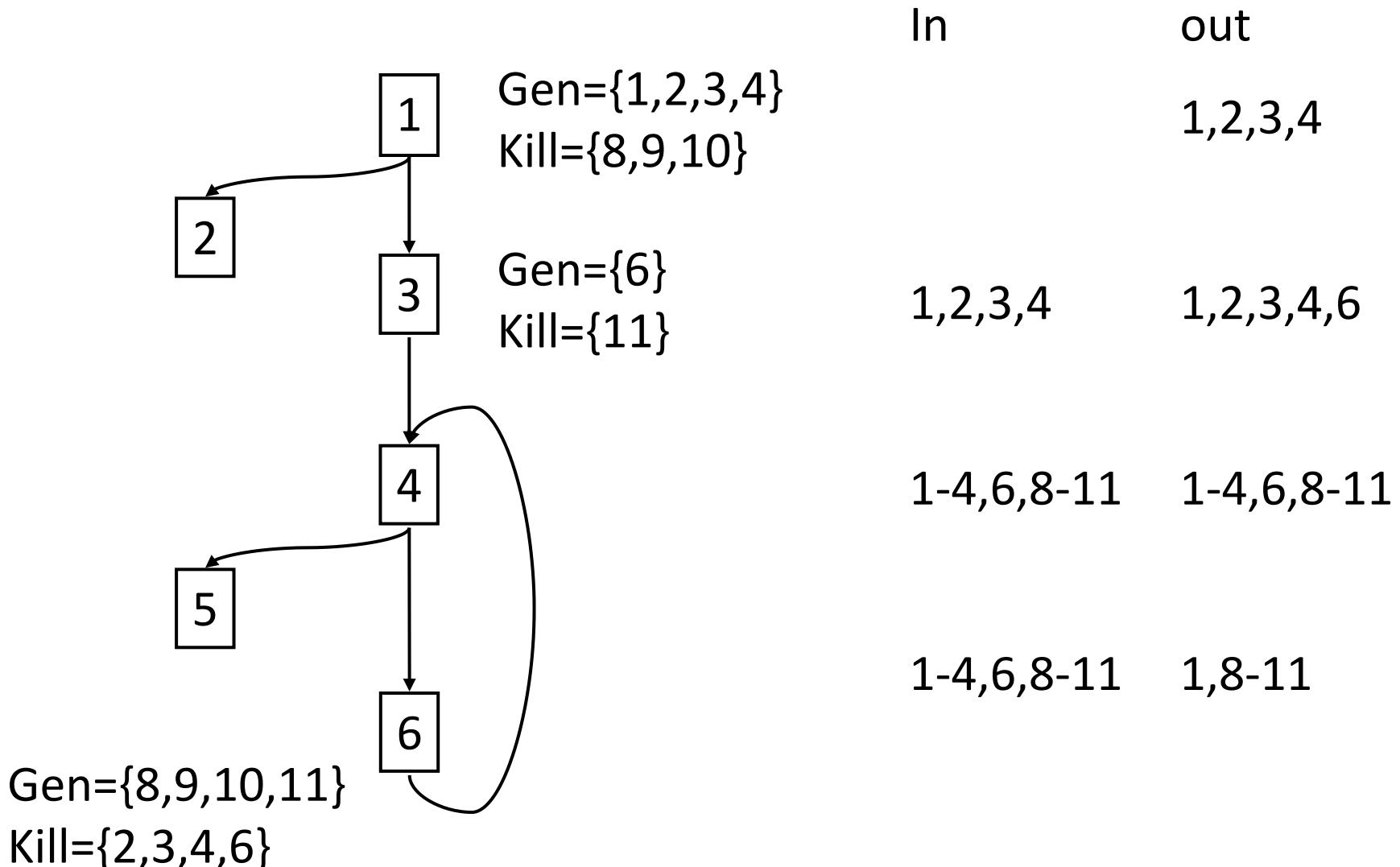
# BB sets

|   |                          | Gen | kill |                |
|---|--------------------------|-----|------|----------------|
| 1 | 1: n <- 10               | 1   |      |                |
|   | 2: older <- 0            | 2   | 9    |                |
|   | 3: old <- 1              | 3   | 10   |                |
|   | 4: result <- 0           | 4   | 8    |                |
| 3 | 5: if n <= 1 goto 14     |     |      | 1,2,3,4 8,9,10 |
|   | 6: i <- 2                | 6   | 11 6 | 11             |
|   | 7: if i > n goto 13      |     |      |                |
| 4 | 8: result <- old + older | 8   | 4    |                |
|   | 9: older <- old          | 9   | 2    |                |
|   | 10: old <- result        | 10  | 3    |                |
|   | 11: i <- i + 1           | 11  | 6    |                |
| 6 | 12: JUMP 7               |     | 8-11 | 2-4 , 6        |
|   | 13: return result        |     |      |                |
| 2 | 14: return n             |     |      |                |

# BB sets



# BB sets



# Forward Dataflow

- Reaching definitions is a forward dataflow problem:  
It propagates information from the predecessors of a node to the node
- Defined by:
  - Basic attributes: (gen and kill)
  - Transfer function:  $F_{bb} \quad out[n] = gen[n] \cup (in[n] - kill[n])$
  - Meet operator: union  $in[n] = \bigcup_{p \in pred[n]} out[p]$
  - Set of values (a lattice, in this case powerset of program points)
  - Initial values for each node b
- Solve for fixed point solution

# How to implement?

- Values?
- Gen?
- Kill?
- $F_{bb}$ ?
- Init?
- Order to visit nodes?
- When are we done?
  - In fact, do we know we terminate?

# Implementing RD

- Values: bits in a bit vector
- Gen: 1 in each position generated, otherwise 0
- Kill: 0 in each position killed, otherwise 1
- $F_{bb}$ :  $out[b] = gen[b] \mid (in[b] \ \& \ kill[b])$
- Init  $in[b]=out[b]=0$
  
- When are we done?
- What order to visit nodes? Does it matter?

# RD Worklist algorithm

Initialize:  $\text{in}[B] = \text{out}[b] = \emptyset$

Initialize:  $\text{in}[\text{entry}] = \emptyset$

Work queue,  $W = \text{all Blocks in topological order}$

while ( $|W| \neq 0$ ) {

    remove  $b$  from  $W$

$\text{old} = \text{out}[b]$

$\text{in}[b] = \{\text{over all } \text{pred}(p) \in b\} \cup \text{out}[p]$

$\text{out}[b] = \text{gen}[b] \cup (\text{in}[b] - \text{kill}[b])$

    if ( $\text{old} \neq \text{out}[b]$ )  $W = W \cup \text{succ}(b)$

}

# Storing Rd information

- Use-def chains: for each use of var x in s, a list of definitions of x that reach s

|                          |            |            |
|--------------------------|------------|------------|
| 1: n <- 10               | 1          |            |
| 2: older <- 0            | 1          | 1,2        |
| 3: old <- 1              | 1,2        | 1,2,3      |
| 4: result <- 0           | 1-3        | 1-4        |
| 5: if n <= 1 goto 14     | 1-4        | 1-4        |
| 6: i <- 2                | 1-4        | 1-4,6      |
| 7: if i > n goto 13      | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: result <- old + older | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: old <- result        | 1,3,6,8-11 | 1,6,8-11   |
| 11: i <- i + 1           | 1,6,8-11   | 1,8-11     |
| 12: JUMP 7               | 1,8-11     | 1,8-11     |
| 13: return result        | 1-4,6      | 1-4,6      |
| 14: return n             | 1-4        | 1-4        |

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|                          |            |            |
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| 1: n <- 10               | 1          |            |
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| 3: old <- 1              | 1,2        | 1,2,3      |
| 4: result <- 0           | 1-3        | 1-4        |
| 5: if n <= 1 goto 14     | 1-4        | 1-4        |
| 6: i <- 2                | 1-4        | 1-4,6      |
| 7: if i > n goto 13      | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: result <- old + older | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: older <- old          | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: old <- result        | 1,3,6,8-11 | 1,6,8-11   |
| 11: i <- i + 1           | 1,6,8-11   | 1,8-11     |
| 12: JUMP 7               | 1,8-11     | 1,8-11     |
| 13: return result        | 1-4,6      | 1-4,6      |
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9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

|            |            |
|------------|------------|
| 1          |            |
| 1          | 1,2        |
| 1,2        | 1,2,3      |
| 1-3        | 1-4        |
| 1-4        | 1-4        |
| 1-4        | 1-4,6      |
| 1-4,6,8-11 | 1-4,6,8-11 |
| 1-4,6,8-11 | 1-3,6,8-11 |
| 1-3,6,8-11 | 1,3,6,8-11 |
| 1,3,6,8-11 | 1,6,8-11   |
| 1,6,8-11   | 1,8-11     |
| 1,8-11     | 1,8-11     |
| 1-4,6      | 1-4,6      |
| 1-4        | 1-4        |

# Storing Rd information

- Use-def chains: for each use of var x in s, a list of definitions of x that reach s

```
1: n <- 10
2: older <- 0
3: old <- 1
4: result <- 0
5: if n <= 1 goto 14
6: i <- 2
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
11: i <- i + 1
12: JUMP 7
13: return result
14: return n
```

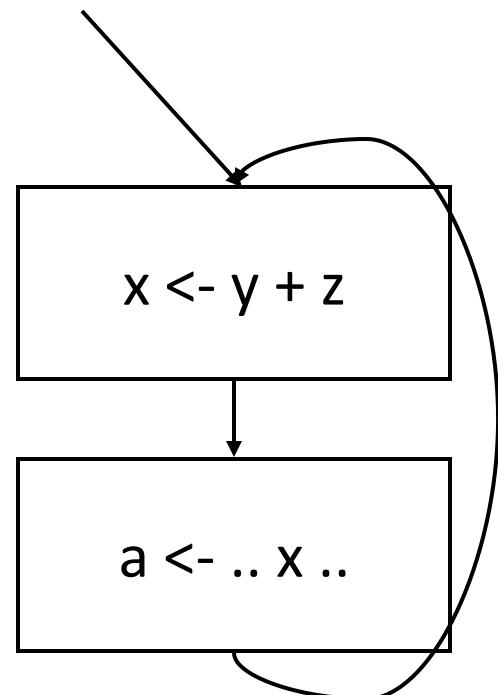
|            |            |
|------------|------------|
| 1          |            |
| 1          | 1,2        |
| 1,2        | 1,2,3      |
| 1-3        | 1-4        |
| 1-4        | 1-4        |
| 1-4        | 1-4,6      |
| 1-4,6,8-11 | 1-4,6,8-11 |
| 1-4,6,8-11 | 1-3,6,8-11 |
| 1-3,6,8-11 | 1,3,6,8-11 |
| 1,3,6,8-11 | 1,6,8-11   |
| 1,6,8-11   | 1,8-11     |
| 1,8-11     | 1,8-11     |
| 1-4,6      | 1-4,6      |
| 1-4        | 1-4        |

# Constant Folding + DCE

|                                                  |            |            |
|--------------------------------------------------|------------|------------|
| 1: <code>n &lt;- 10</code>                       | 1          |            |
| 2: <code>older &lt;- 0</code>                    | 1          | 1,2        |
| 3: <code>old &lt;- 1</code>                      | 1,2        | 1,2,3      |
| 4: <code>result &lt;- 0</code>                   | 1-3        | 1-4        |
| 5: <del>if <code>10 &lt;= 1</code> goto 14</del> | 1-4        | 1-4        |
| 6: <code>i &lt;- 2</code>                        | 1-4        | 1-4,6      |
| 7: <del>if <code>i &gt; 10</code> goto 13</del>  | 1-4,6,8-11 | 1-4,6,8-11 |
| 8: <code>result &lt;- old + older</code>         | 1-4,6,8-11 | 1-3,6,8-11 |
| 9: <code>older &lt;- old</code>                  | 1-3,6,8-11 | 1,3,6,8-11 |
| 10: <code>old &lt;- result</code>                | 1,3,6,8-11 | 1,6,8-11   |
| 11: <code>i &lt;- i + 1</code>                   | 1,6,8-11   | 1,8-11     |
| 12: <code>JUMP 7</code>                          | 1,8-11     | 1,8-11     |
| 13: <code>return result</code>                   | 1-4,6      | 1-4,6      |
| 14: <del><code>return 10</code></del>            | 1-4        | 1-4        |

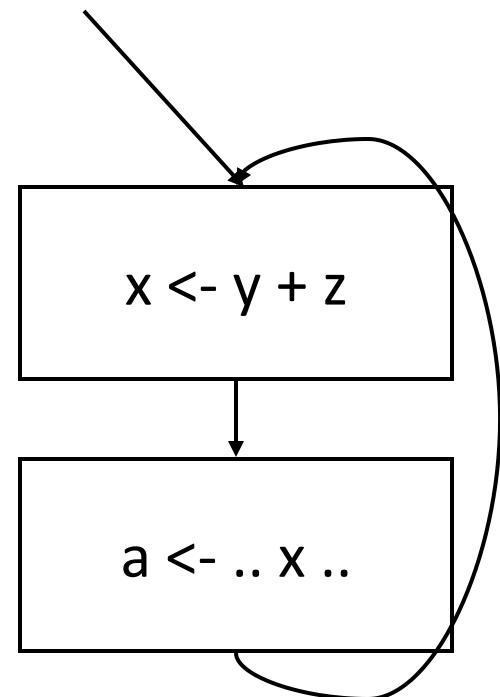
# Loop Invariant Code Motion

- When can expression be moved out of a loop?



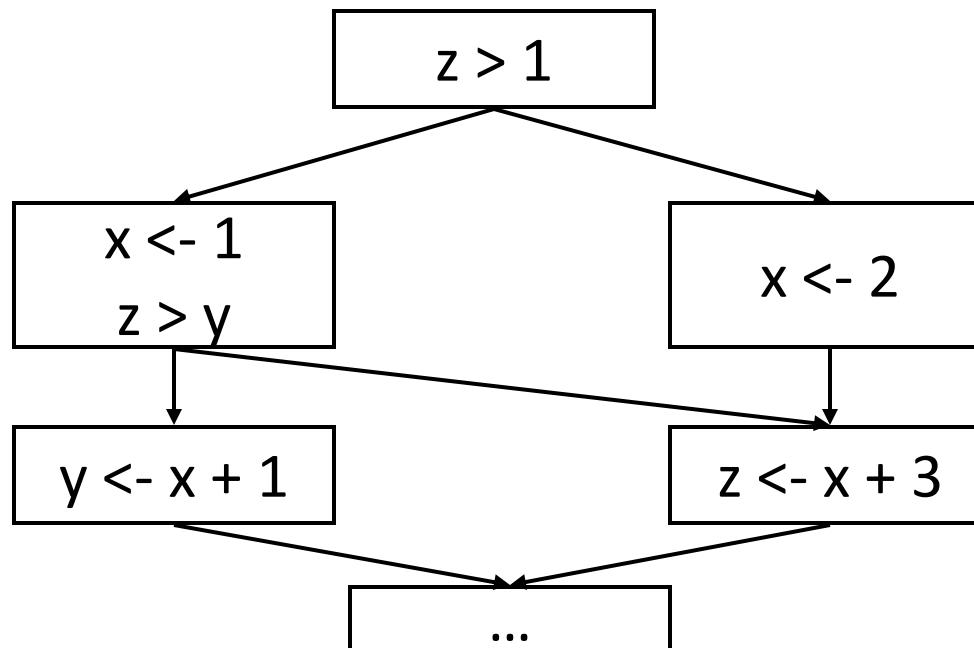
# Loop Invariant Code Motion

- When can expression be moved out of a loop?
- When all reaching definitions of operands are outside of loop, expression is loop invariant
- Use ud-chains to detect



# Def-use chains are valuable too

- Def-use chain: for each definition of var x, a list of all uses of that definition
- Computed from liveness analysis, a backward dataflow problem
- Def-use is NOT symmetric to use-def



# Liveness (def-use chains)

- A variable  $x$  is live-out of a stmt  $s$  if  $x$  can be used along some path starting at  $s$ , otherwise  $x$  is dead.

# Liveness as a dataflow problem

- This is a backwards analysis
  - A variable is live out if used by a successor
  - Gen: For a use: indicate it is live coming into  $s$
  - Kill: Defining a variable  $v$  in  $s$  makes it dead before  $s$  (unless  $s$  uses  $v$  to define  $v$ )
  - Lattice is just live (top) and dead (bottom)
- Values are variables
- $In[n] = \text{variables live before } n$   
 $= (out[n] - kill[n]) \cup gen[n]$
- $Out[n] = \text{variables live after } n$   
 $= \bigcup_{s \in succ(n)} In[s]$

# Dead Code Elimination

- Code is dead if it has no effect on the outcome of the program.
- When is code dead?

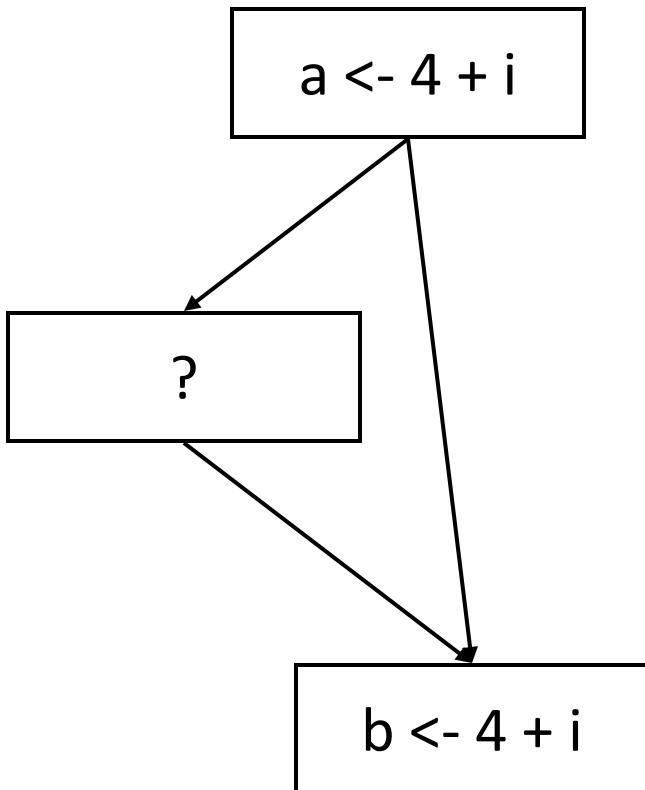
# Dead Code Elimination

- Code is dead if it has no effect on the outcome of the program.
- When is code dead?
  - When the definition is dead, and
  - When the instruction has no side effects
- So:
  - run liveness
  - Construct def-use chains
  - Any instruction which has no users and has no side effects can be eliminated

# So Far

|          | Union<br>(may) | intersection<br>(must) |
|----------|----------------|------------------------|
| Forward  | Reaching defs  |                        |
| Backward | Live variables |                        |

# When can we do CSE?



# Available Expressions

- $X+Y$  is “available” at statement S if
  - $x+y$  is computed along every path from the start to S AND
  - neither x nor y is modified after the last evaluation of  $x+y$

a <- b+c

b <- a-d

c <- b+c

d <- a-d

# Available Expressions

- $X+Y$  is “available” at statement S if
  - $x+y$  is computed along every path from the start to S AND
  - neither x nor y is modified after the last evaluation of  $x+y$

a <- b+c

b <- a-d

c <- b+c ← b+c Not available, since b redefined

d <- a-d ← a-d is available

# Computing Available Expressions

- Forward or backward?
- Values?
- Lattice?
- $\text{gen}[b] =$
- $\text{kill}[b] =$
- $\text{out}[b] =$
- $\text{in}[b] =$
- initialization?

# Computing Available Expressions

- Forward
- Values: all expressions
- Lattice: available, not-avail
- $\text{gen}[b] = \text{if } b \text{ evals expr } e \text{ and doesn't}$   
    define variables used in  $e$
- $\text{kill}[b] = \text{if } b \text{ assigns to } x,$   
    then all exprs using  $x$  are killed.
- $\text{out}[b] = (\text{in}[b] - \text{kill}[b]) \cup \text{gen}[b]$
- $\text{in}[b] = \text{what to do at a join point?}$
- initialization?

# Computing Available Expressions

- Forward
- Values: all expressions
- Lattice: available, not-avail
- $\text{gen}[b] = \text{if } b \text{ evals expr } e \text{ and doesn't}$   
define variables used in  $e$
- $\text{kill}[b] = \text{if } b \text{ assigns to } x, \text{exprs}(x)$  are killed
- $\text{out}[b] = (\text{in}[b] - \text{kill}[b]) \cup \text{gen}[b]$
- $\text{in}[b] = \text{An expr is avail only if avail on ALL edges, so:}$   
 $\text{in}[b] = \cap \text{ over all } p \in \text{pred}(b), \text{out}[p]$
- Initialization
  - All nodes, but entry are set to ALL avail
  - Entry is set to NONE avail

# Constructing Gen & Kill

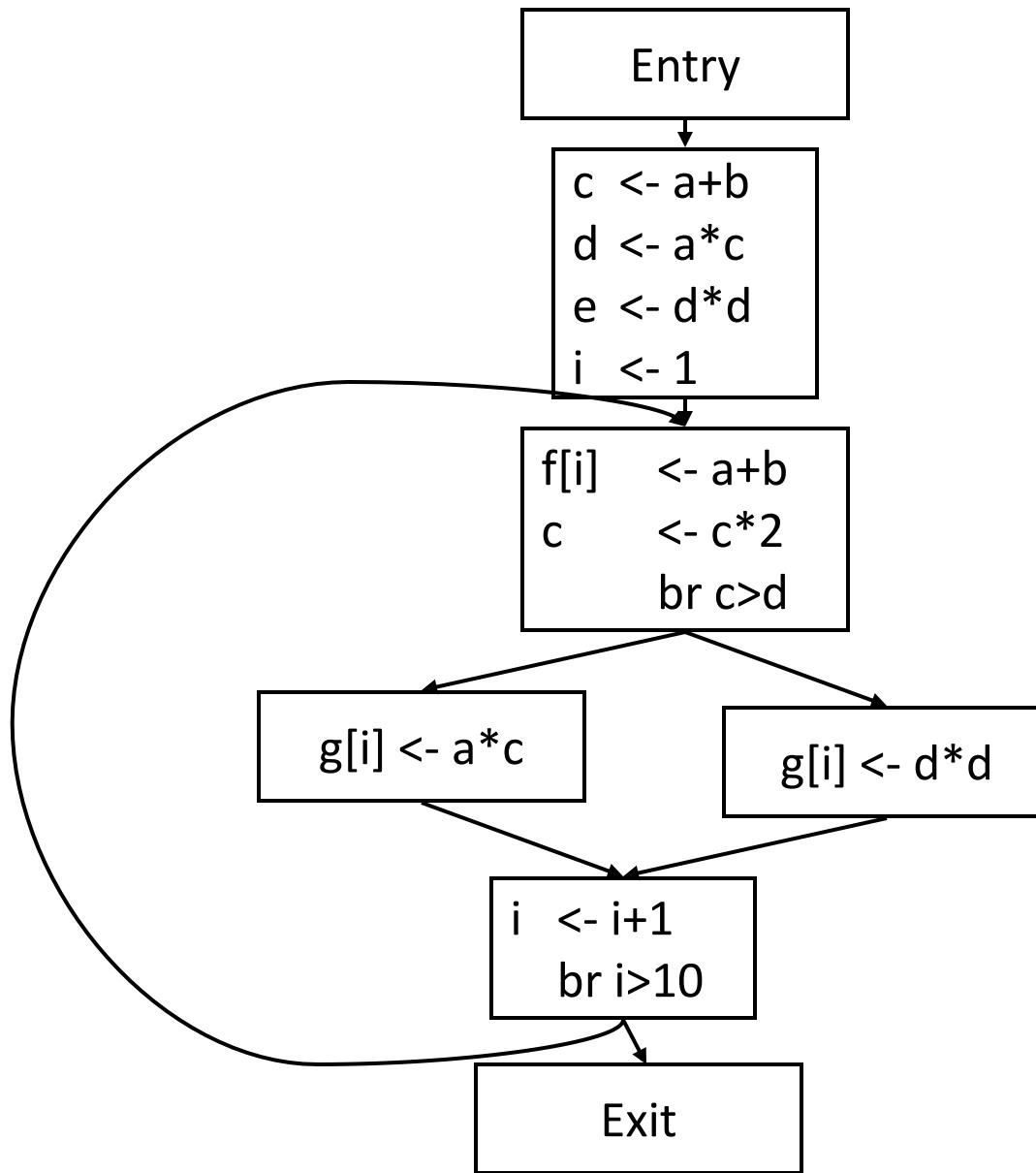
| Stmt s                         | Gen                                  | Kill                          |
|--------------------------------|--------------------------------------|-------------------------------|
| $t \leftarrow x \text{ op } y$ | $\{x \text{ op } y\}\text{-kill}[s]$ | {exprs containing t}          |
| $t \leftarrow M[a]$            | $\{M[a]\}\text{-kill}[s]$            |                               |
| $M[a] \leftarrow b$            |                                      |                               |
| $f(a, \dots)$                  |                                      | $\{M[x] \text{ for all } x\}$ |
| $t \leftarrow f(a, \dots)$     |                                      |                               |

# Constructing Gen & Kill

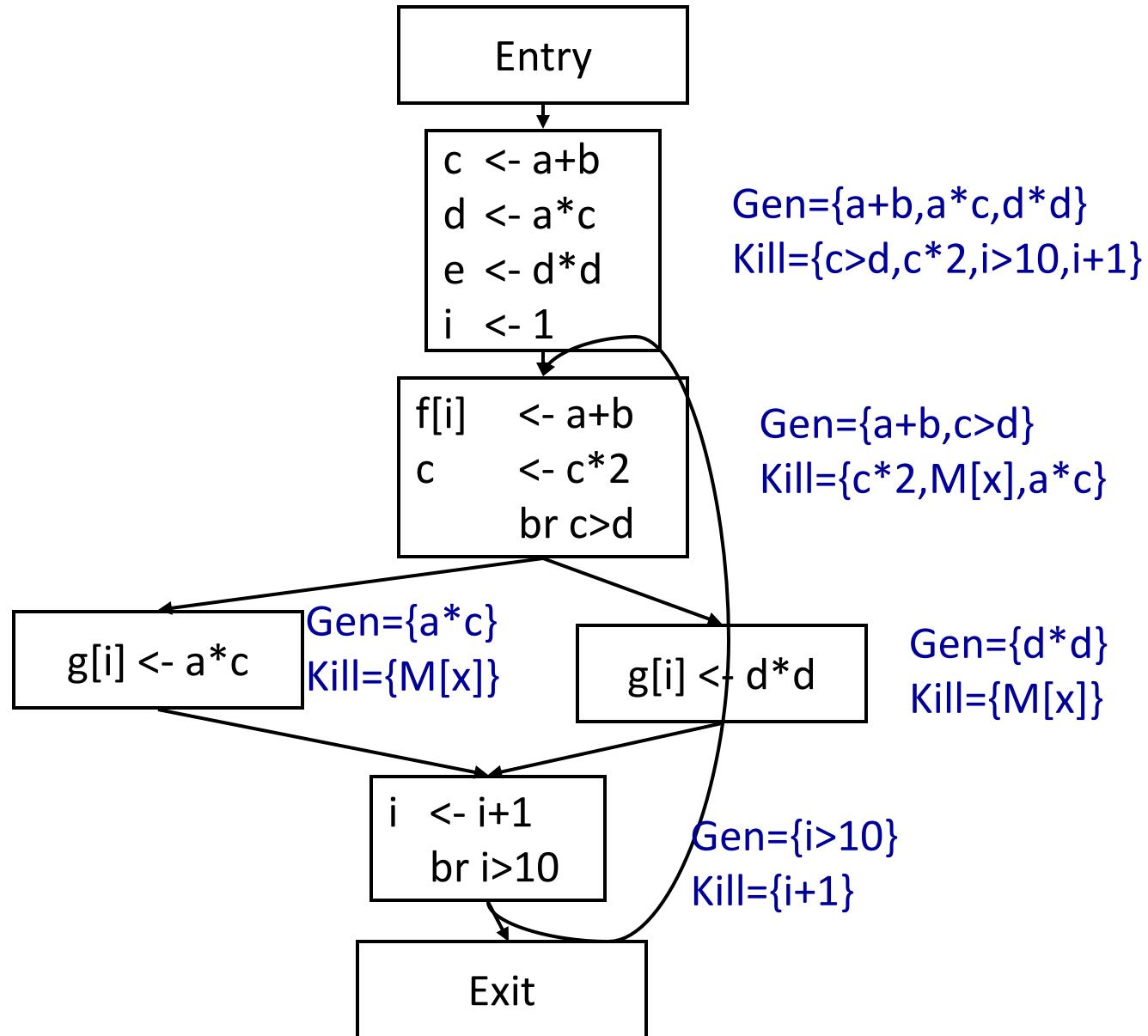
| Stmt s                         | Gen                                  | Kill                                       |
|--------------------------------|--------------------------------------|--------------------------------------------|
| $t \leftarrow x \text{ op } y$ | $\{x \text{ op } y\}\text{-kill}[s]$ | {exprs containing t}                       |
| $t \leftarrow M[a]$            | $\{M[a]\}\text{-kill}[s]$            | {exprs containing t}                       |
| $M[a] \leftarrow b$            | {}                                   | {for all x, $M[x]$ }                       |
| $f(a, \dots)$                  | {}                                   | {for all x, $M[x]$ }                       |
| $t \leftarrow f(a, \dots)$     | {}                                   | {exprs containing t<br>for all x, $M[x]$ } |

# Example

$$\begin{aligned} \text{out}[b] &= (\text{in}[b] - \text{kill}[b]) \cup \text{gen}[b] \\ \text{in}[b] &= \cap_{p \in \text{pred}(b)} \text{out}[p] \end{aligned}$$

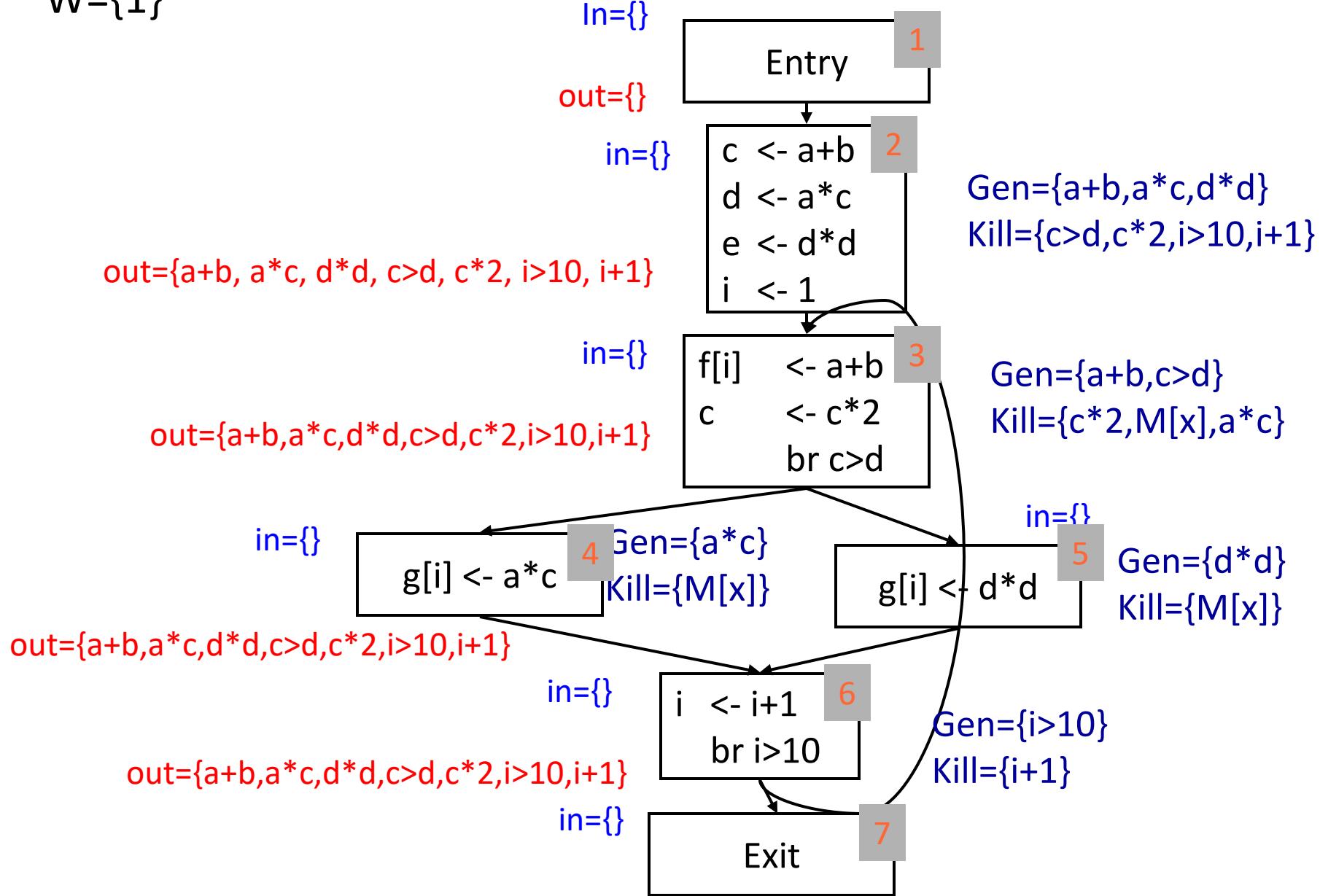


# Example



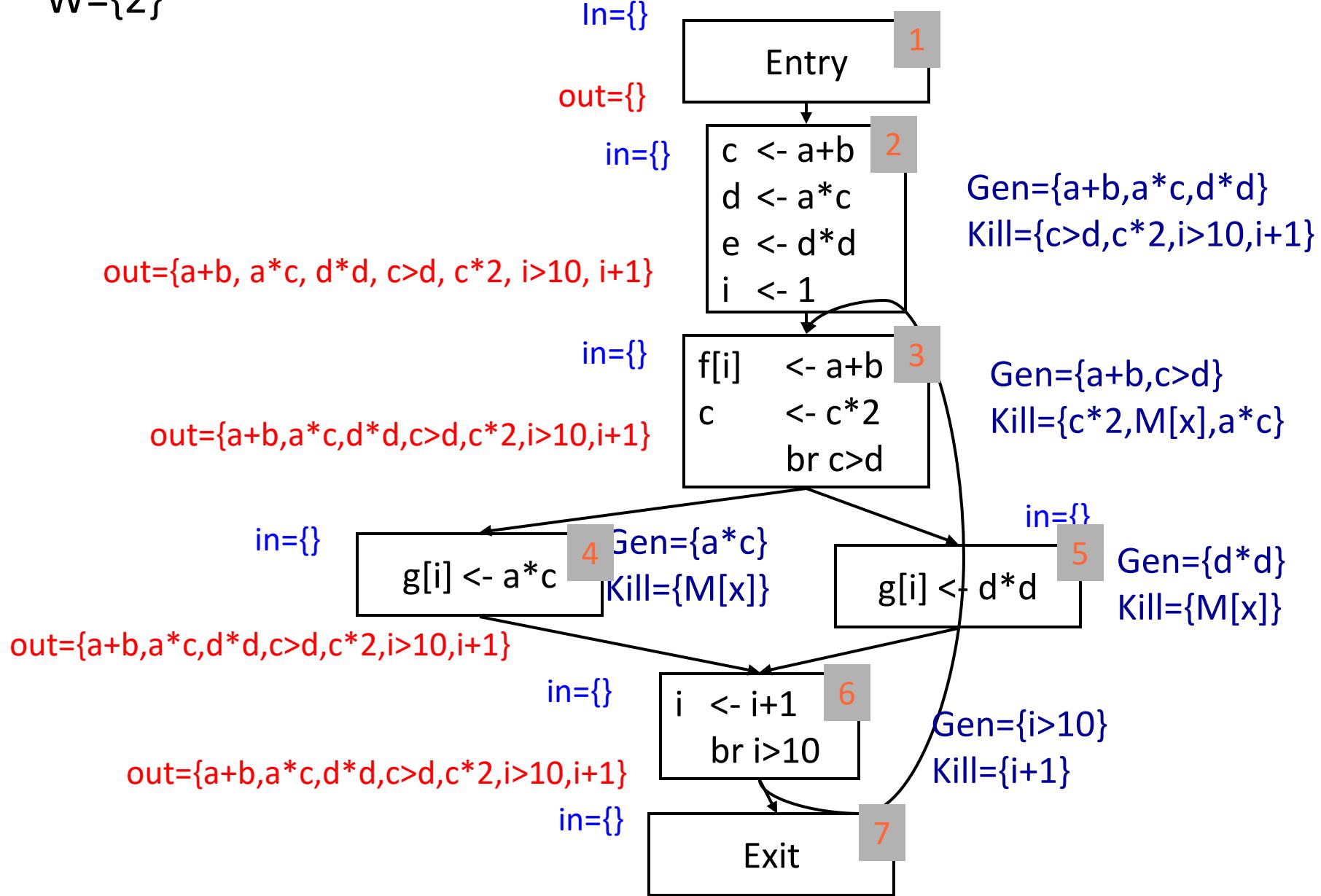
# Example

$W=\{1\}$



# Example

$W=2$



# Example

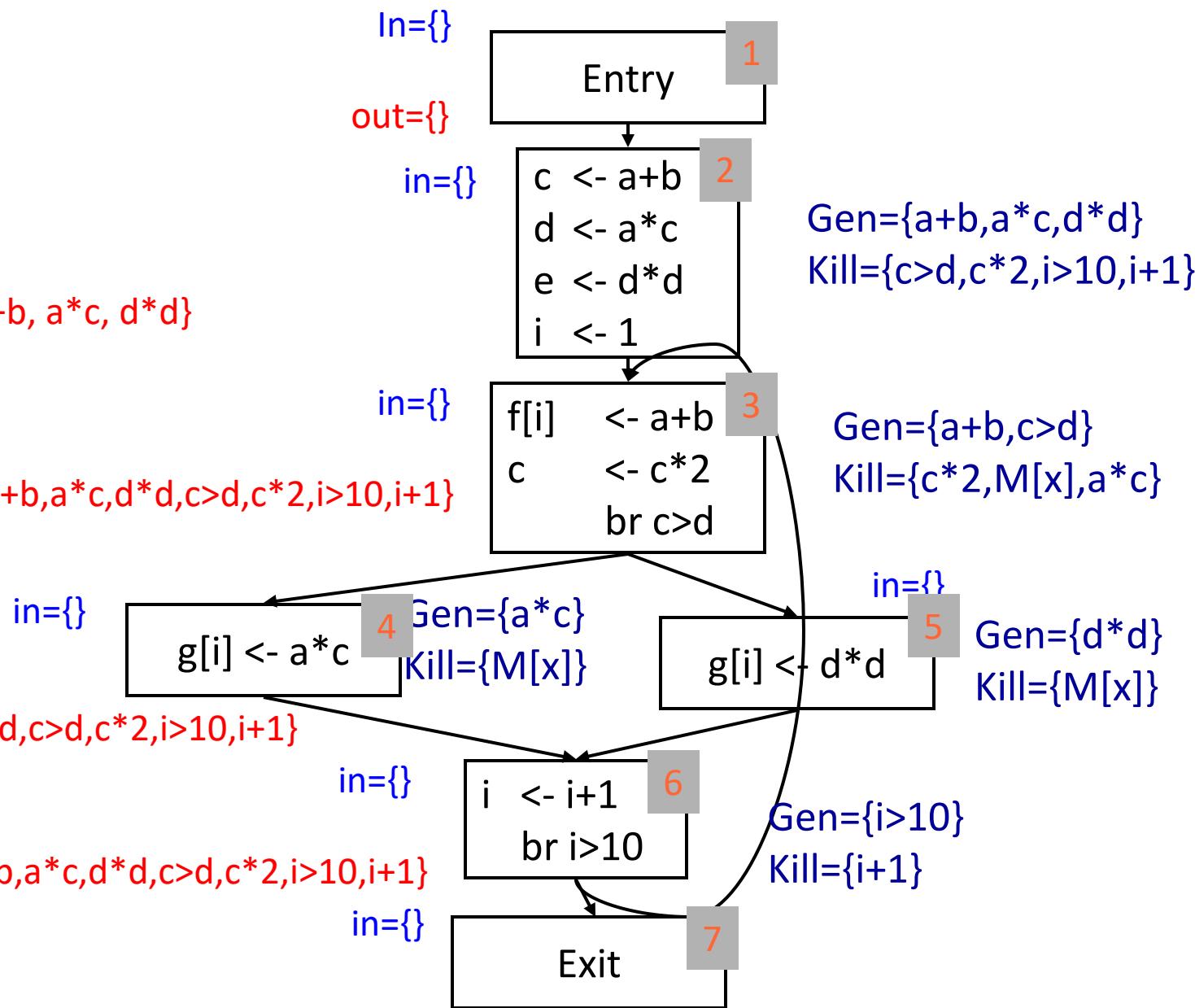
$W=\{3\}$

$out=\{a+b, a*c, d*d\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$



# Example

$W=\{4,5\}$

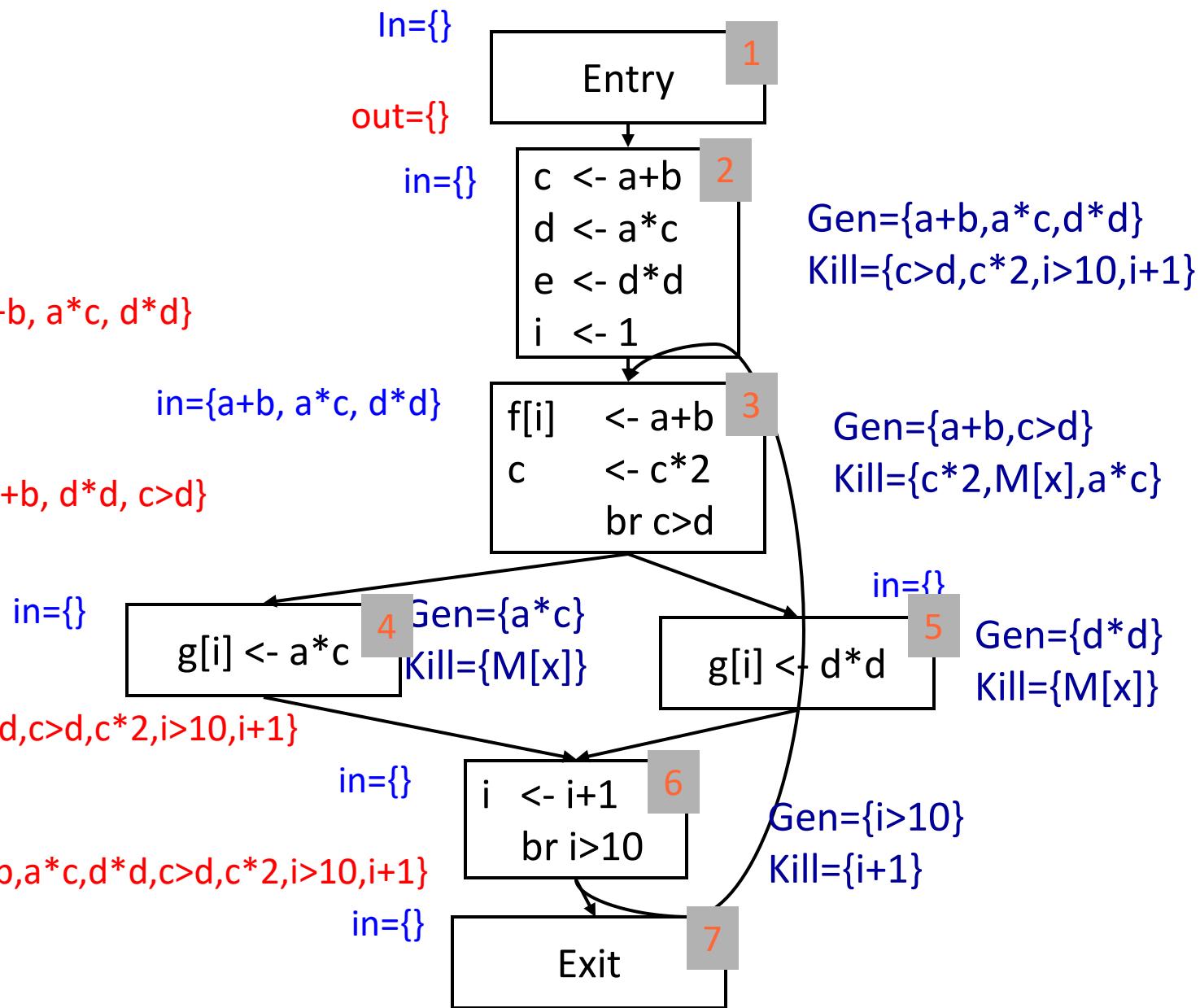
$out=\{a+b, a*c, d*d\}$

$in=\{a+b, a*c, d*d\}$

$out=\{a+b, d*d, c>d\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$



# Example

$W=6$

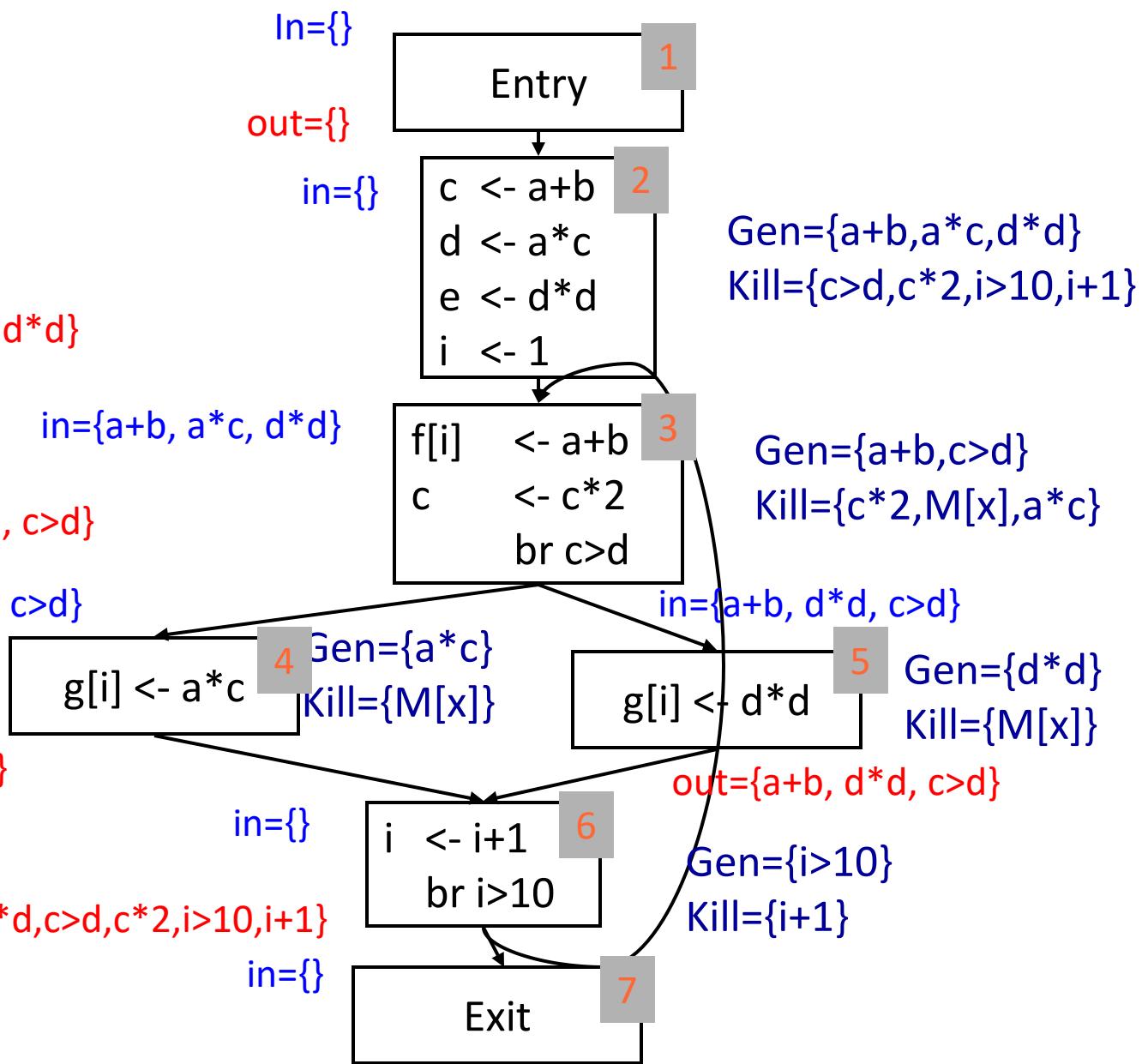
$out=\{a+b, a*c, d*d\}$

$out=\{a+b, d*d, c>d\}$

$in=\{a+b, d*d, c>d\}$

$out=\{a+b, d*d, c>d, a*c\}$

$out=\{a+b, a*c, d*d, c>d, c*2, i>10, i+1\}$



# Example

$W=\{3,7\}$

$out=\{a+b, a*c, d*d\}$

$out=\{a+b, d*d, c>d\}$

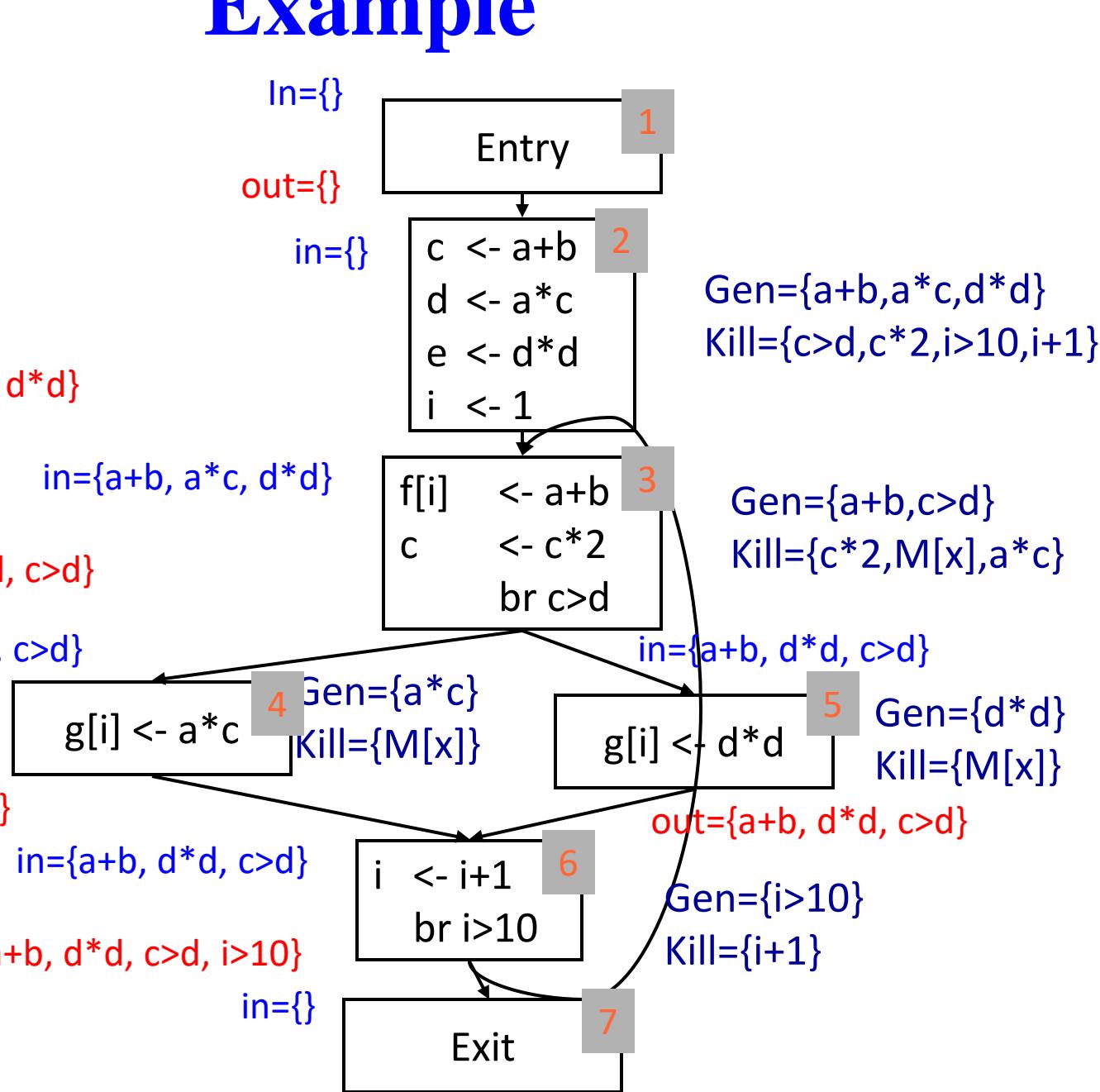
$in=\{a+b, d*d, c>d\}$

$out=\{a+b, d*d, c>d, a*c\}$

$out=\{a+b, d*d, c>d, i>10\}$

$in=\{\}$

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# Example

$W=3$

$out=\{a+b, a*c, d*d\}$

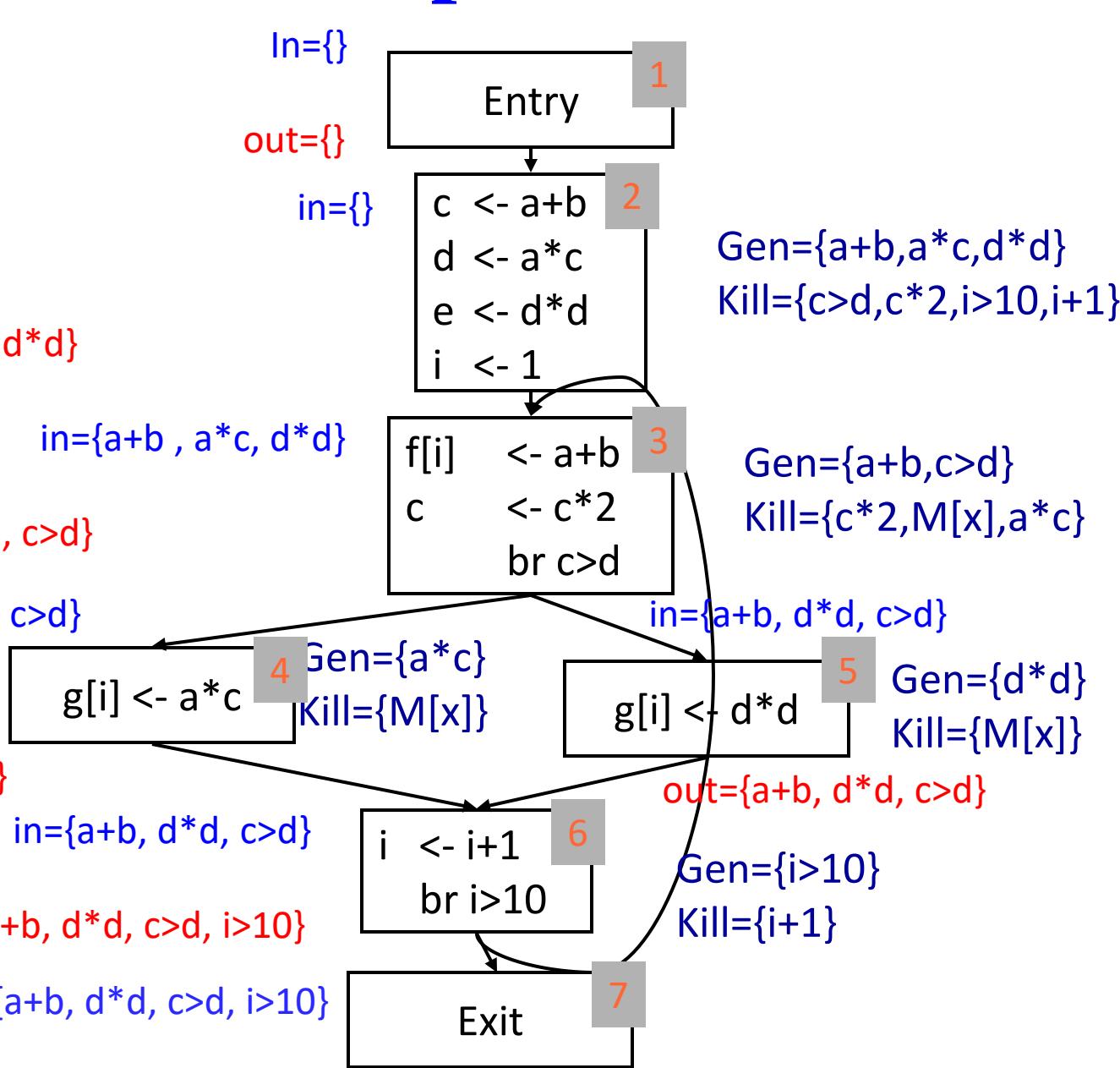
$out=\{a+b, d*d, c>d\}$

$in=\{a+b, d*d, c>d\}$

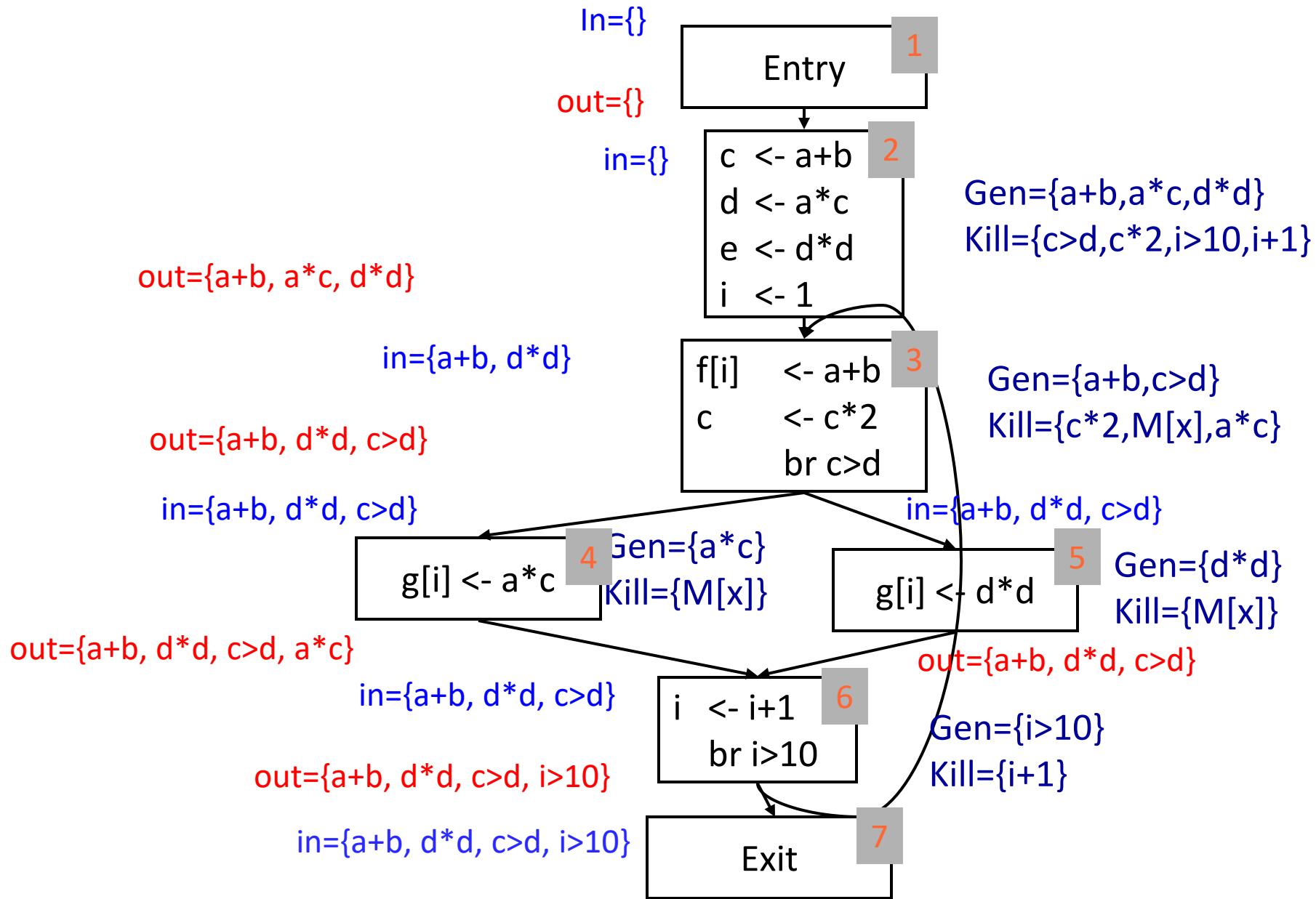
$out=\{a+b, d*d, c>d, a*c\}$

$out=\{a+b, d*d, c>d, i>10\}$

$in=\{a+b, d*d, c>d, i>10\}$



# Example

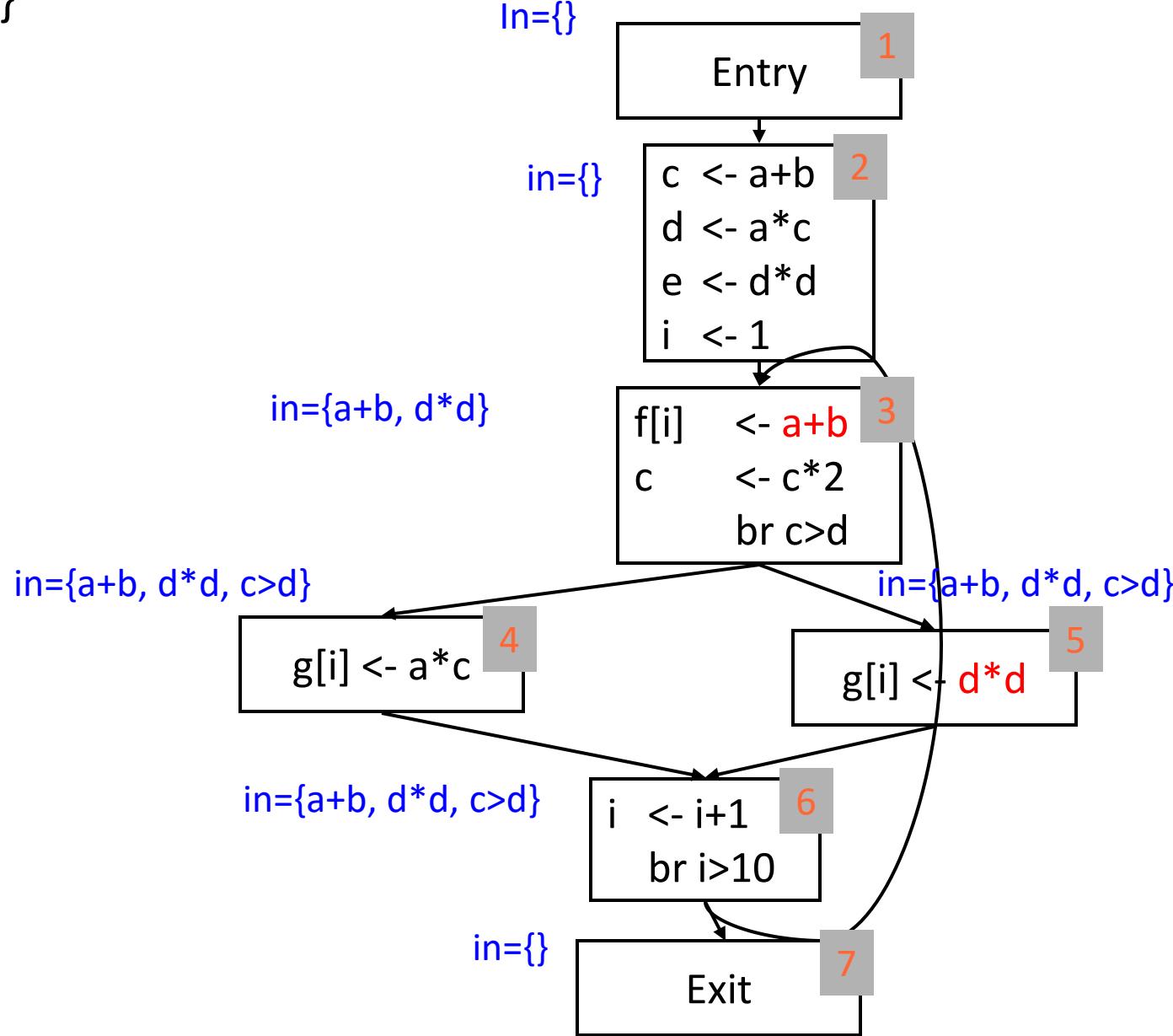


# CSE

- Calculate Available expressions
- For every stmt in program
  - If expression,  $x \text{ op } y$ , is available {
    - Compute reaching expressions for “ $x \text{ op } y$ ” at this stmt
    - foreach stmt in RE of the form  $t <- x \text{ op } y$ 
      - rewrite at:     $t' <- x \text{ op } y$
      - $t <- t'$
  - }
  - replace “ $x \text{ op } y$ ” in stmt with  $t'$

# Find x op y available

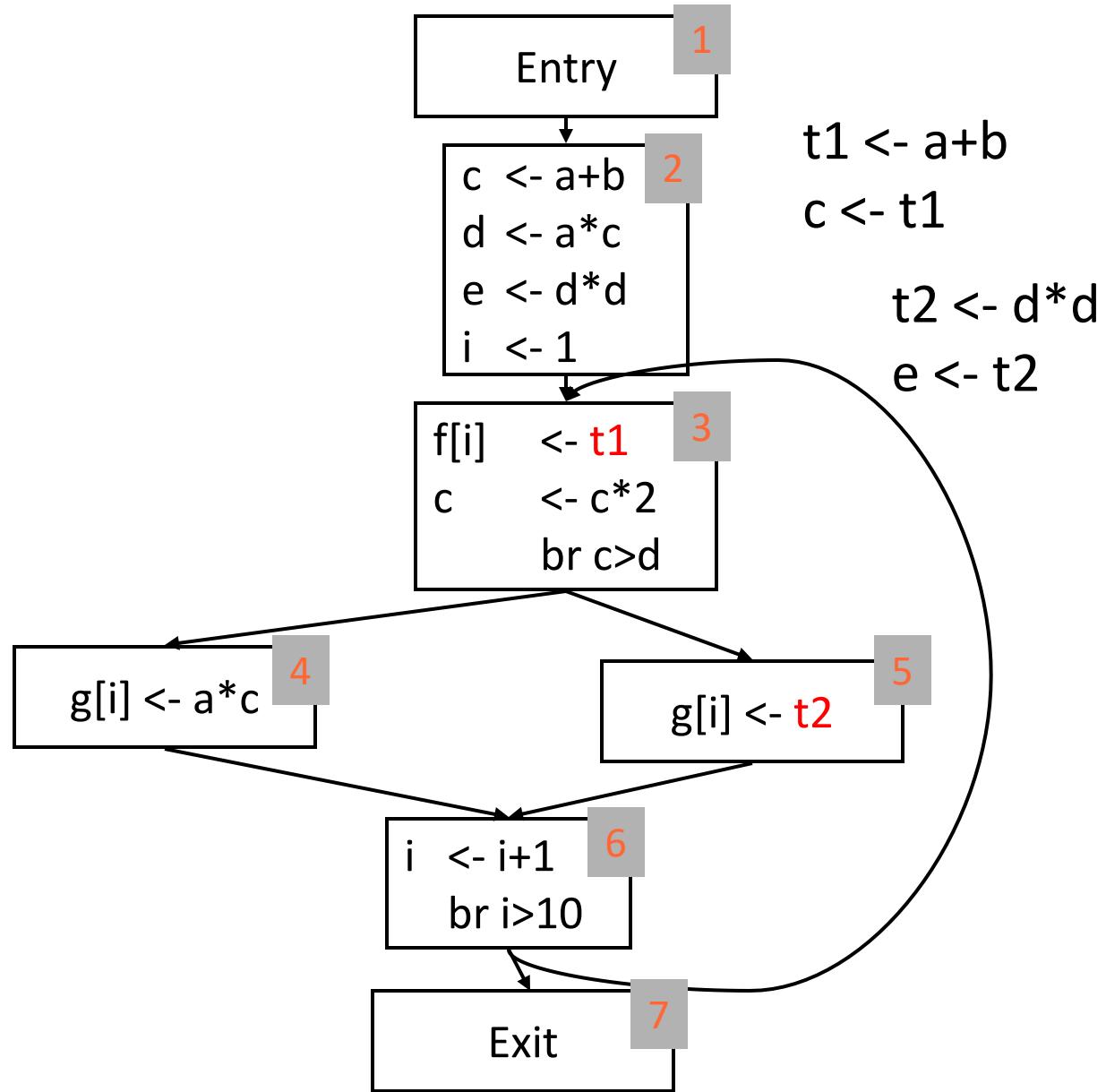
$W = \{3\}$



# Calculating Reaching Expressions

- Could be dataflow problem, but not needed enough, so ...
- To find RE for “ $x \text{ op } y$ ” at stmt S
  - traverse cfg backward from S until
    - reach  $t \leftarrow x + y$  (& put into RE)
    - reach definition of x or y

# Example



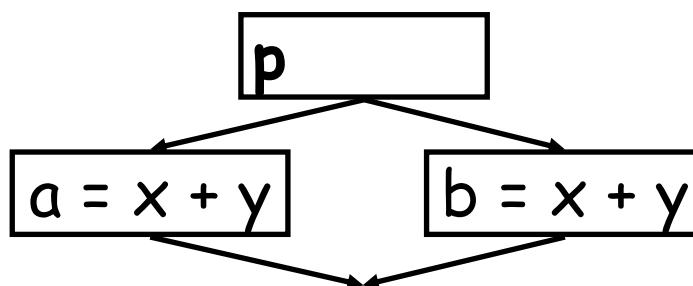
# Dataflow Summary

|          | Union<br>(may) | intersection<br>(must) |
|----------|----------------|------------------------|
| Forward  | Reaching defs  | Available exprs        |
| Backward | Live variables | very busy<br>exprs     |

Later in course we look at bidirectional dataflow

# Very Busy Expressions

- A Backward, Must data flow analysis
- An expression  $e$  is *very busy at point p* if On every path from  $p$ ,  $e$  is evaluated before the value of  $e$  is changed
- Optimization
  - Can hoist very busy expression computation



# Forward Must Data Flow Algorithm

$\text{Out}(s) = \text{Gen}(s)$  for all statements  $s$

$W = \{\text{all statements}\}$

Repeat

    Take  $s$  from  $W$

$\text{In}(s) = \bigcap_{s' \in \text{pred}(s)} \text{Out}(s')$

$\text{Temp} = \text{Gen}(s) \cup (\text{In}(s) - \text{Kill}(s))$

    If ( $\text{temp} \neq \text{Out}(s)$ ) {

$\text{Out}(s) = \text{temp}$

$W = W \cup \text{succ}(s)$

    }

Until  $W = \emptyset$

# Forward May Data Flow Algorithm

$\text{Out}(s) = \text{Gen}(s)$  for all statements  $s$

$W = \{\text{all statements}\}$

Repeat

    Take  $s$  from  $W$

$\text{In}(s) = \bigcup_{s' \in \text{pred}(s)} \text{Out}(s')$

$\text{Temp} = \text{Gen}(s) \cup (\text{In}(s) - \text{Kill}(s))$

    If ( $\text{temp} \neq \text{Out}(s)$ ) {

$\text{Out}(s) = \text{temp}$

$W = W \cup \text{succ}(s)$

    }

Until  $W = \emptyset$

# Backward May Data Flow Algorithm

$In(s) = Gen(s)$  for all statements  $s$

$W = \{\text{all statements}\}$  (worklist)

Repeat

    Take  $s$  from  $W$

$Out(s) = \cup_{s' \in succ(s)} In(s')$

$Temp = Gen(s) \cup (Out(s) - Kill(s))$

    If ( $temp \neq In(s)$ ) {

$In(s) = temp$

$W = W \cup pred(s)$

    }

Until  $W = \emptyset$

# Backward Must Data Flow Algorithm

$ln(s) = Gen(s)$  for all statements  $s$

$W = \{\text{all statements}\}$  (worklist)

Repeat

    Take  $s$  from  $W$

$Out(s) = \bigcap_{s' \in succ(s)} ln(s')$

$Temp = Gen(s) \cup (Out(s) - Kill(s))$

    If ( $temp \neq ln(s)$ ) {

$ln(s) = temp$

$W = W \cup pred(s)$

    }

Until  $W = \emptyset$