

# Dataflow Analysis

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# Overview

## today's lecture

control flow graphs

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control flow graphs

data flow analyses

- liveness analysis
- reaching definitions
- available expressions

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## today's lecture

control flow graphs

data flow analyses

- liveness analysis
- reaching definitions
- available expressions

non-local optimisations

- dead code elimination
- constant & copy propagation
- common subexpression elimination

# I

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## control-flow graphs

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# Intermediate language

## quadruples

### store

$a \leftarrow b \oplus c$

$a \leftarrow b$

### memory access

$a \leftarrow M[b]$

$M[a] \leftarrow b$

### functions

$f(a_1, \dots, a_n)$

$b \leftarrow f(a_1, \dots, a_n)$

### jumps

L:

goto L

if  $a \otimes b$

goto  $L_1$

else

goto  $L_2$

# Control-flow graphs

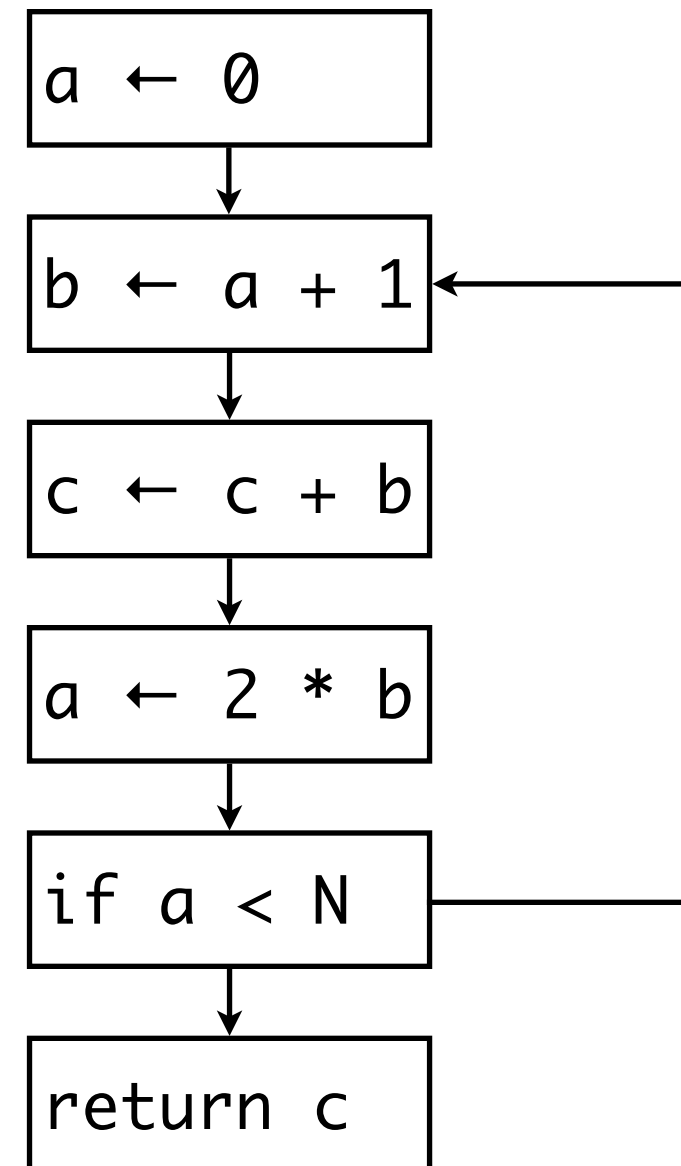
## example

```
    a ← 0
L1:  b ← a + 1
    c ← c + b
    a ← 2 * b
    if a < N
        goto L1
    else
        goto L2
L2:  return c
```

# Control-flow graphs

## example

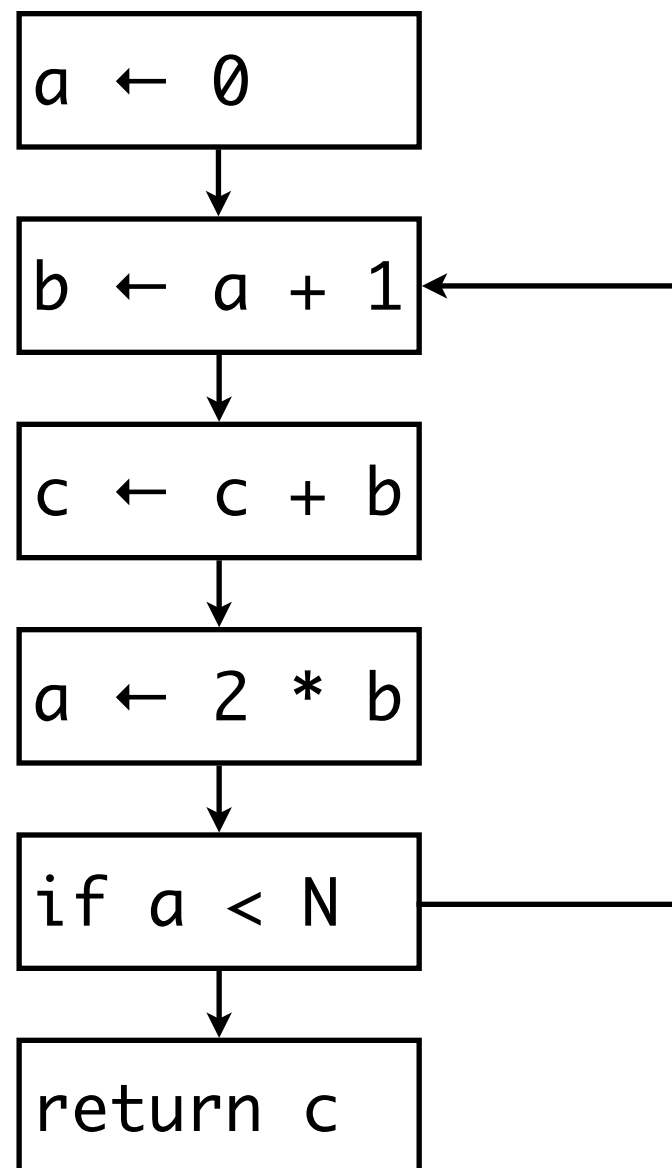
```
    a ← 0
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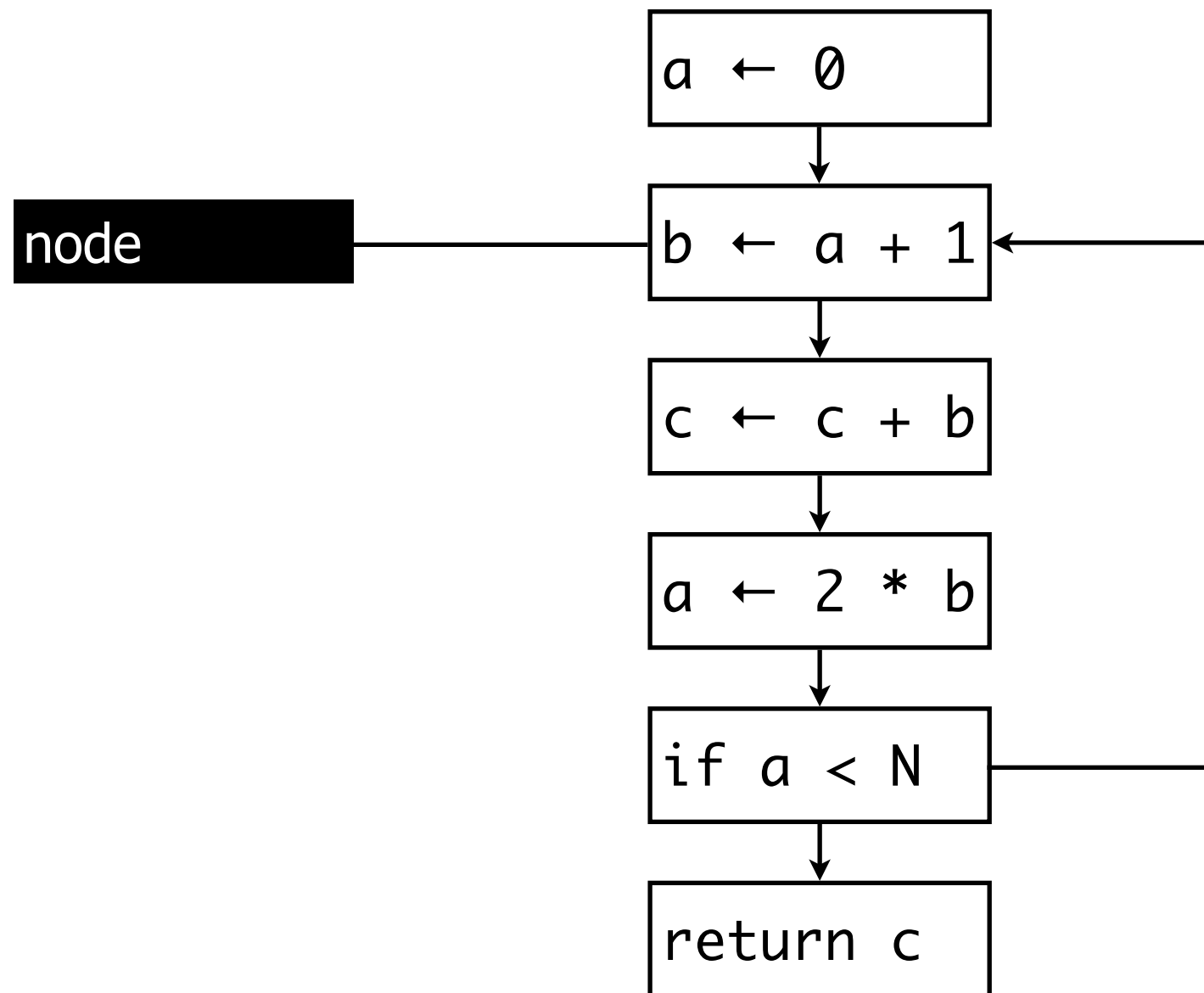
# Control-flow graphs

## terminology



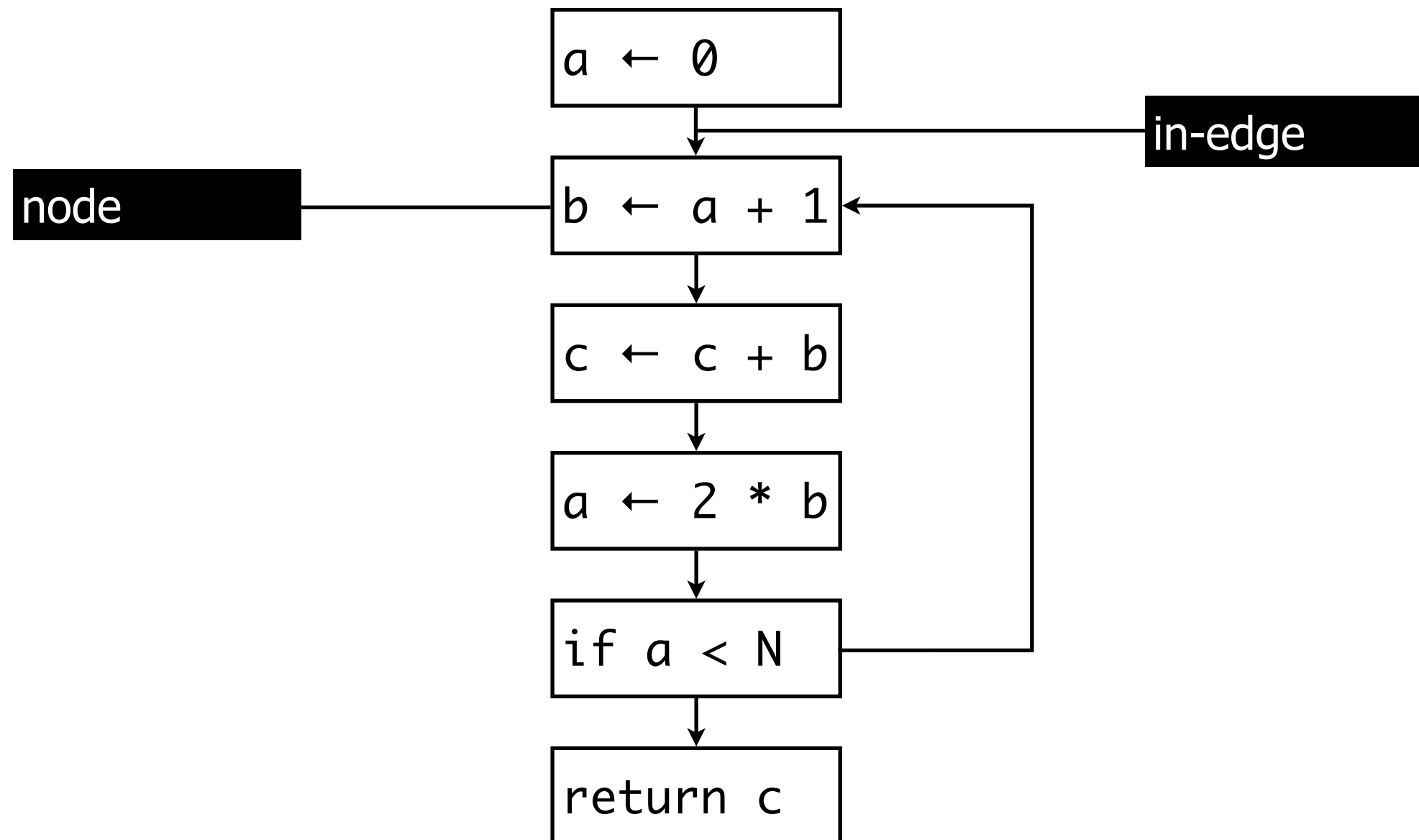
# Control-flow graphs

## terminology



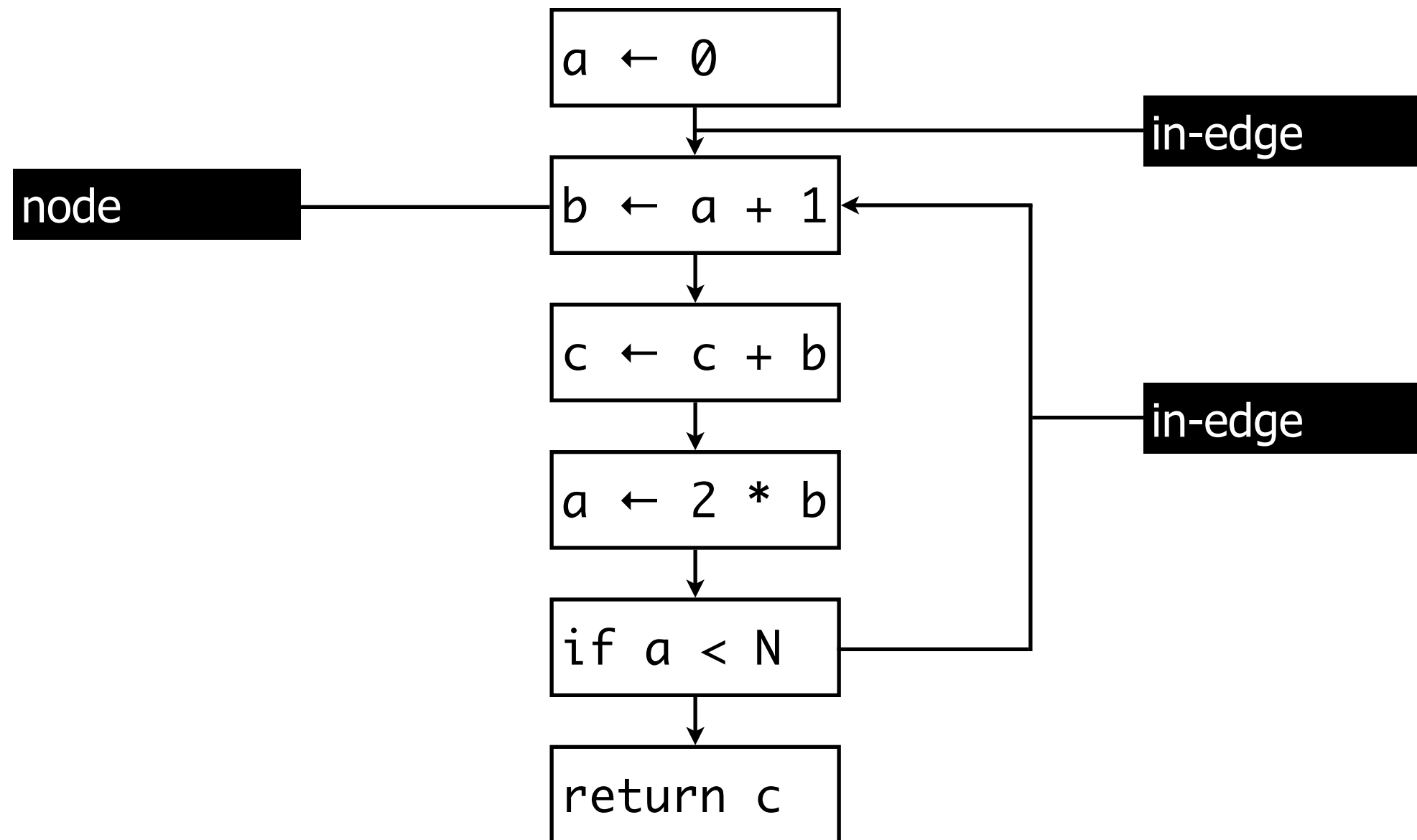
# Control-flow graphs

## terminology



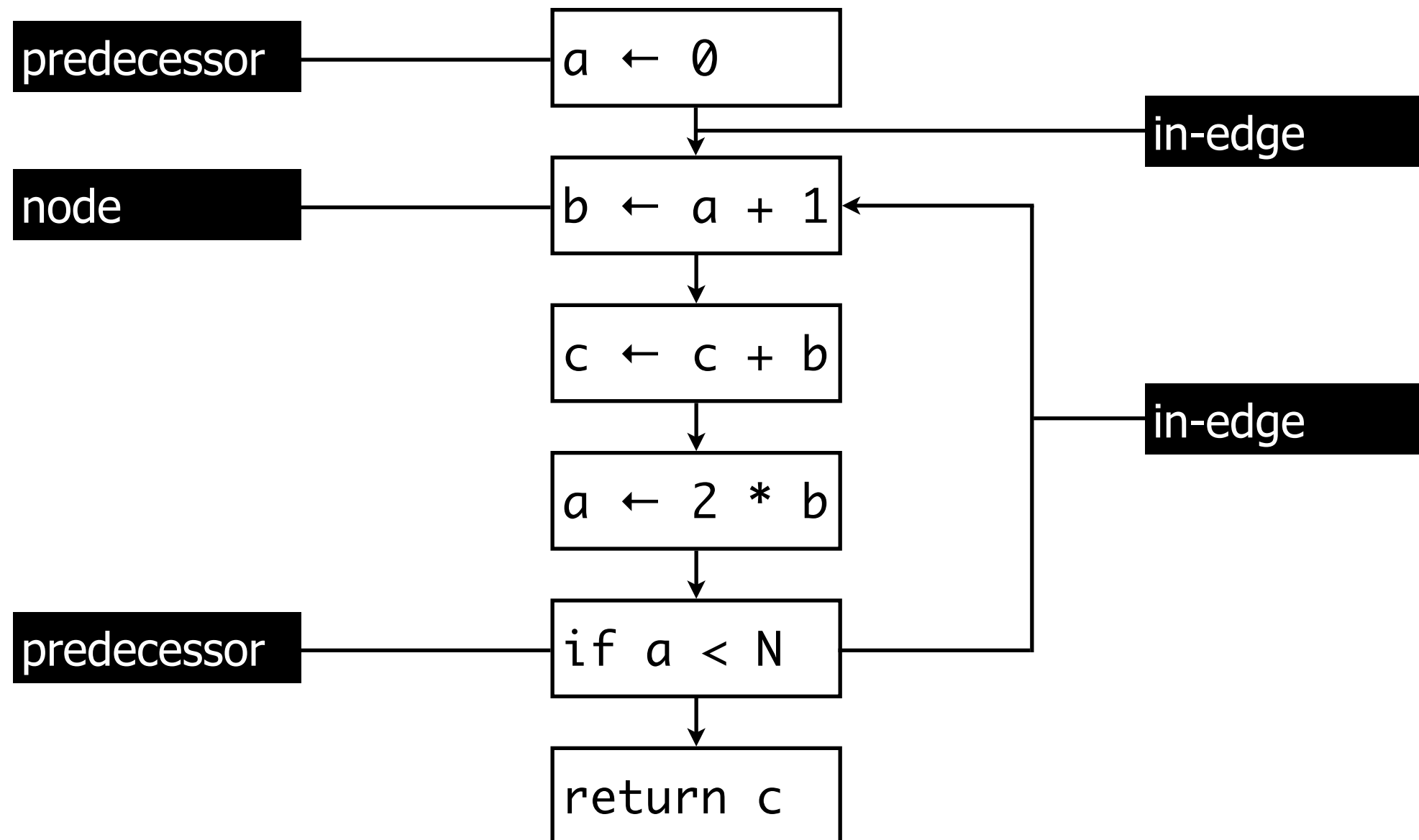
# Control-flow graphs

## terminology



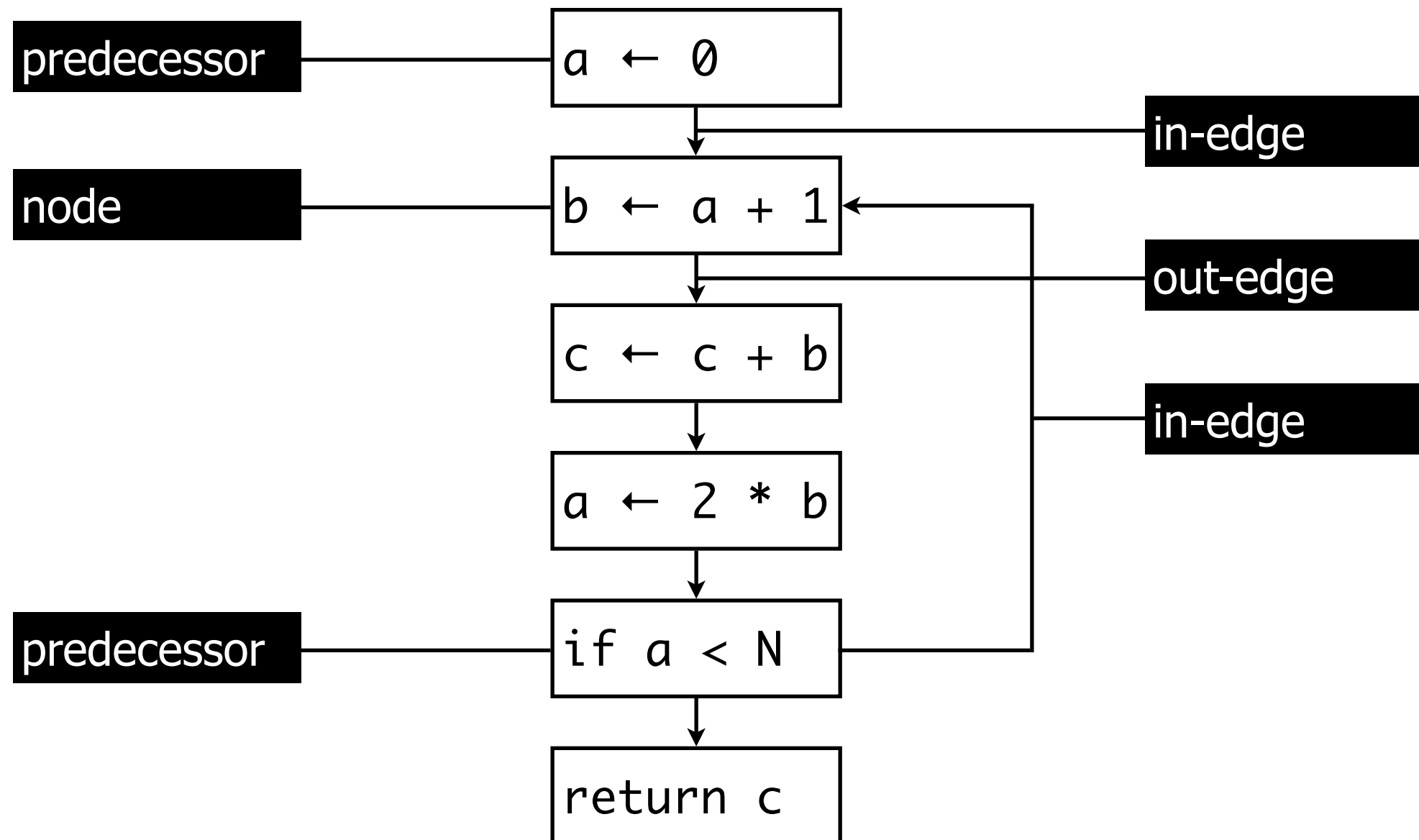
# Control-flow graphs

## terminology



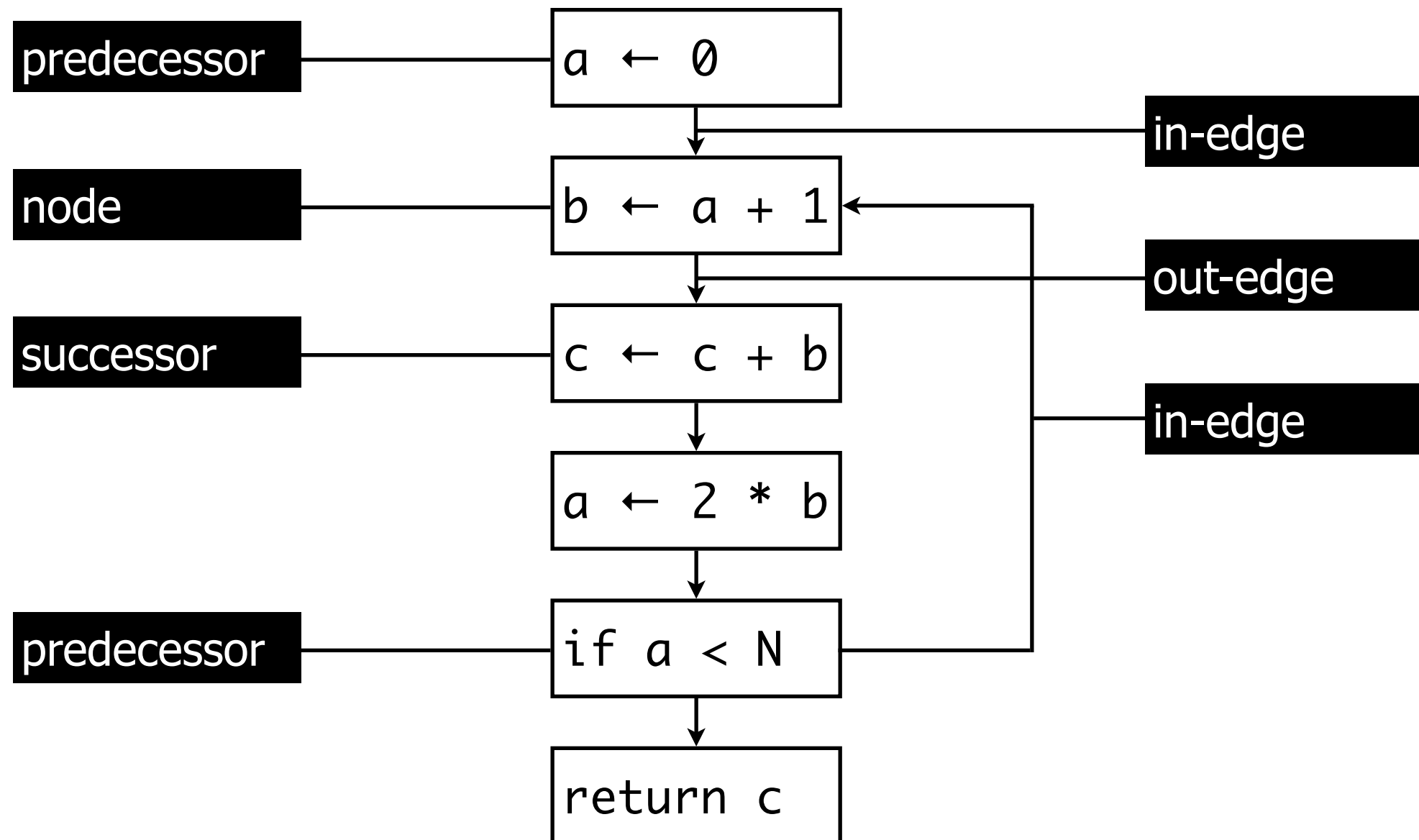
# Control-flow graphs

## terminology



# Control-flow graphs

## terminology



# II

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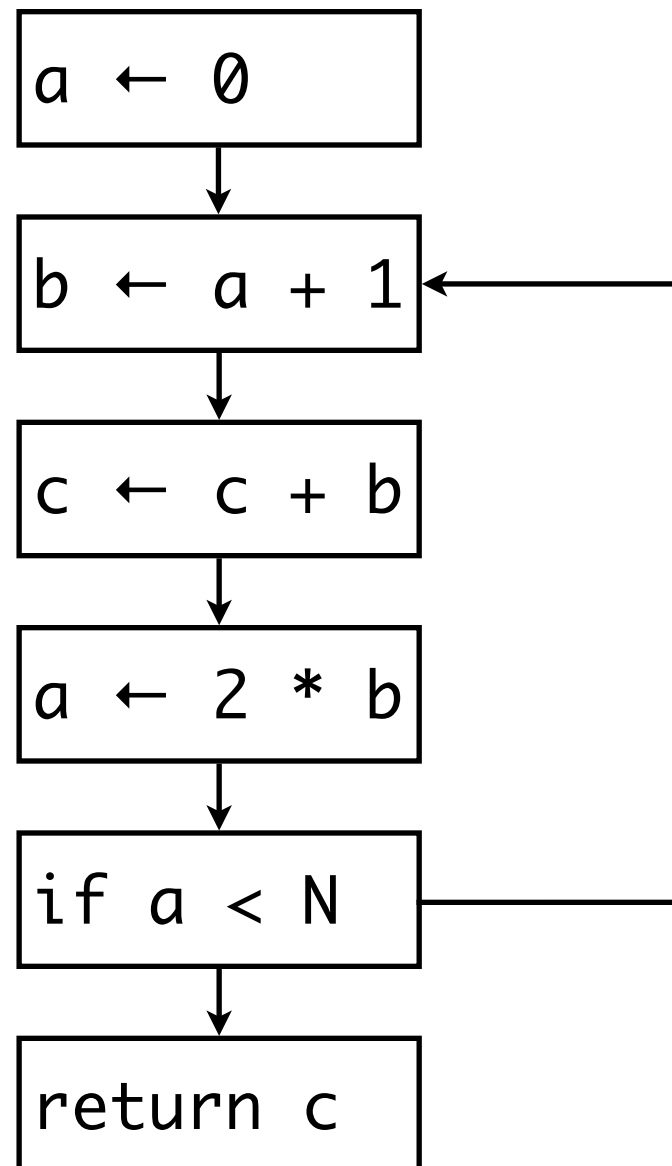
## liveness analysis

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# Liveness analysis

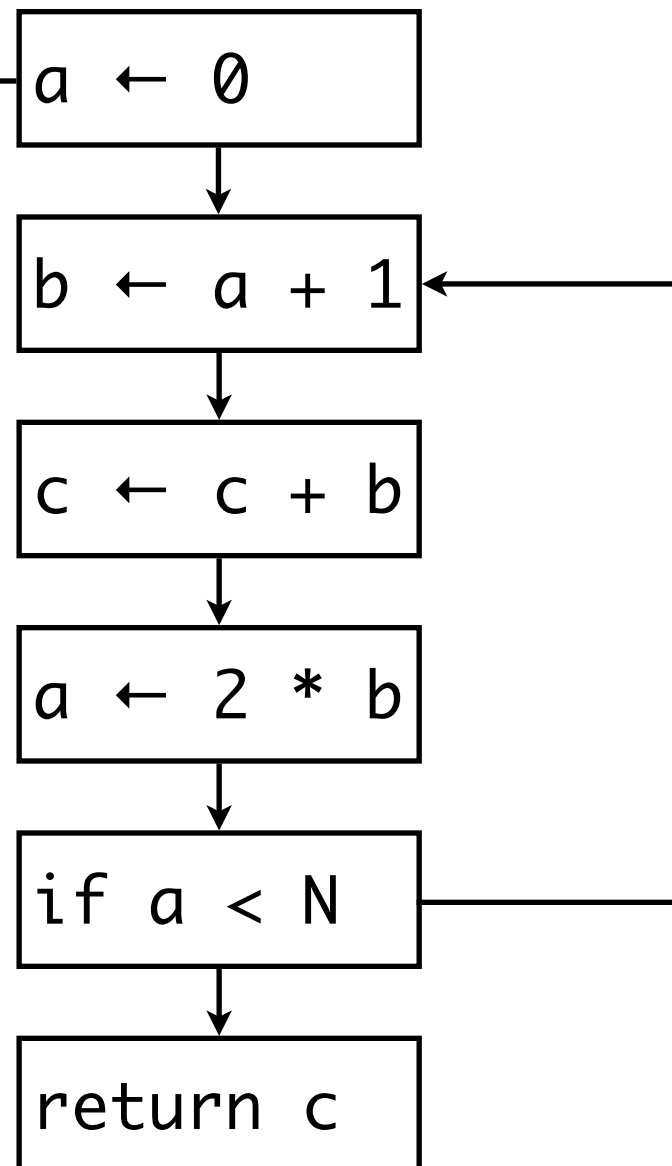
## terminology



# Liveness analysis

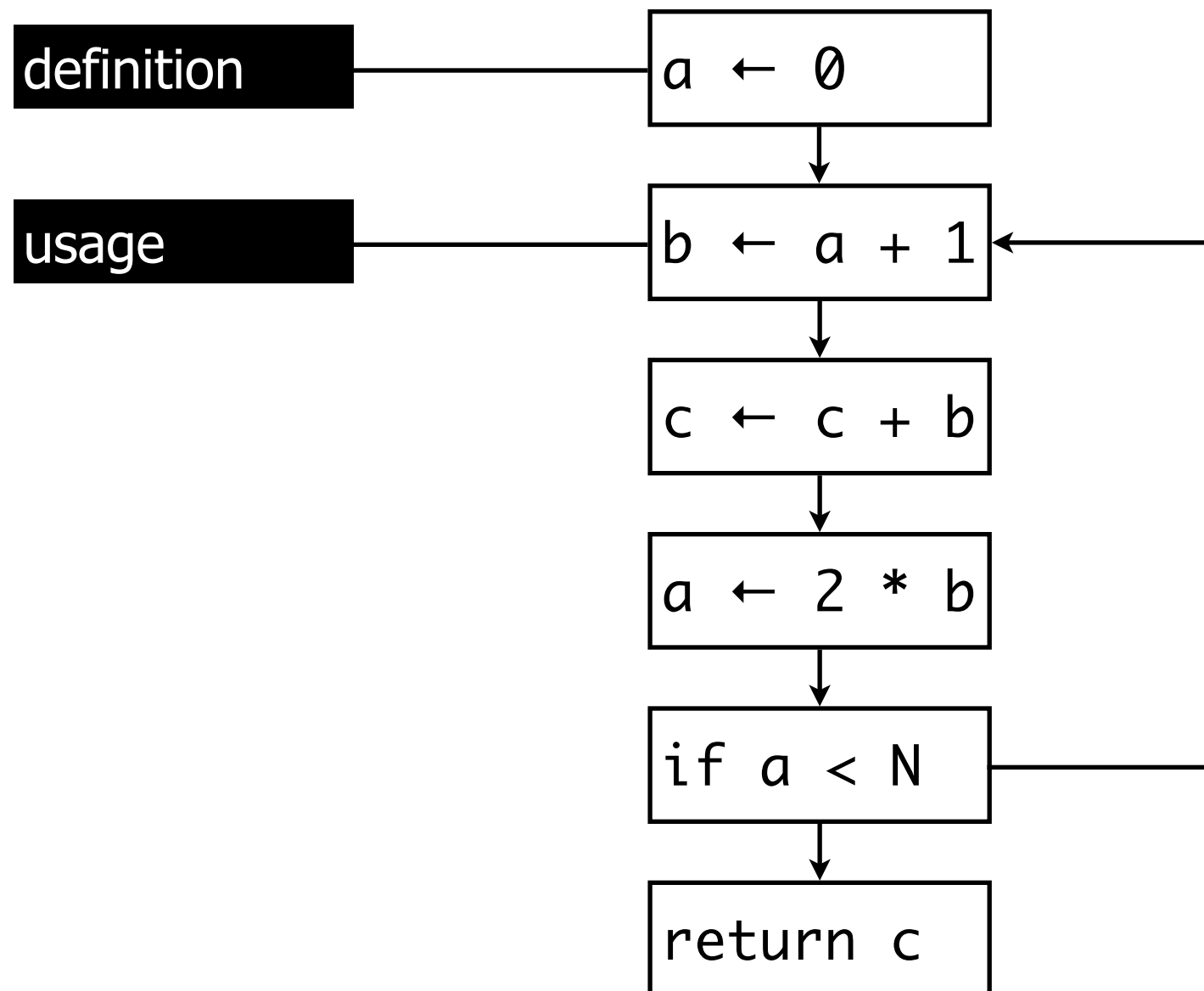
## terminology

definition



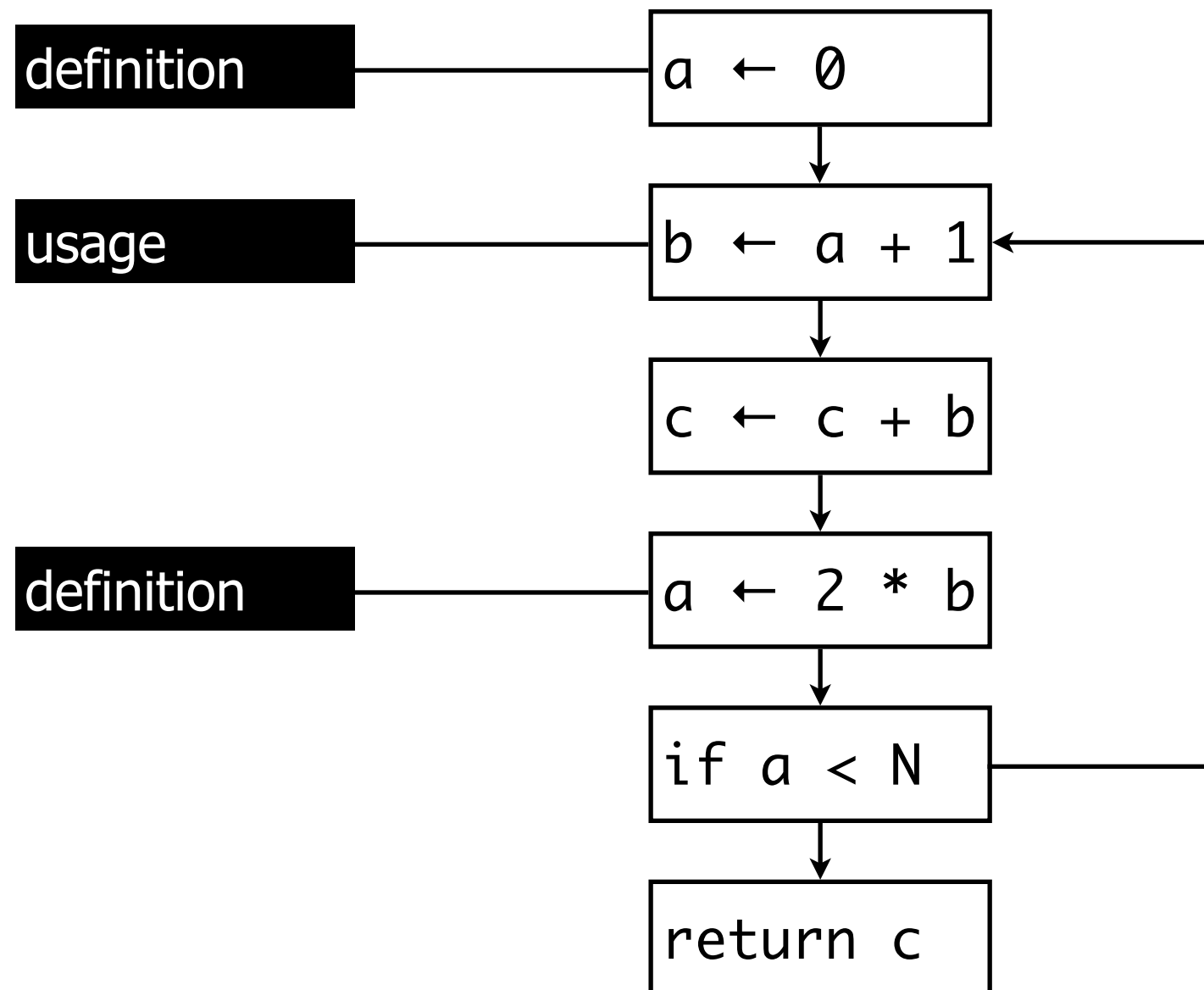
# Liveness analysis

## terminology



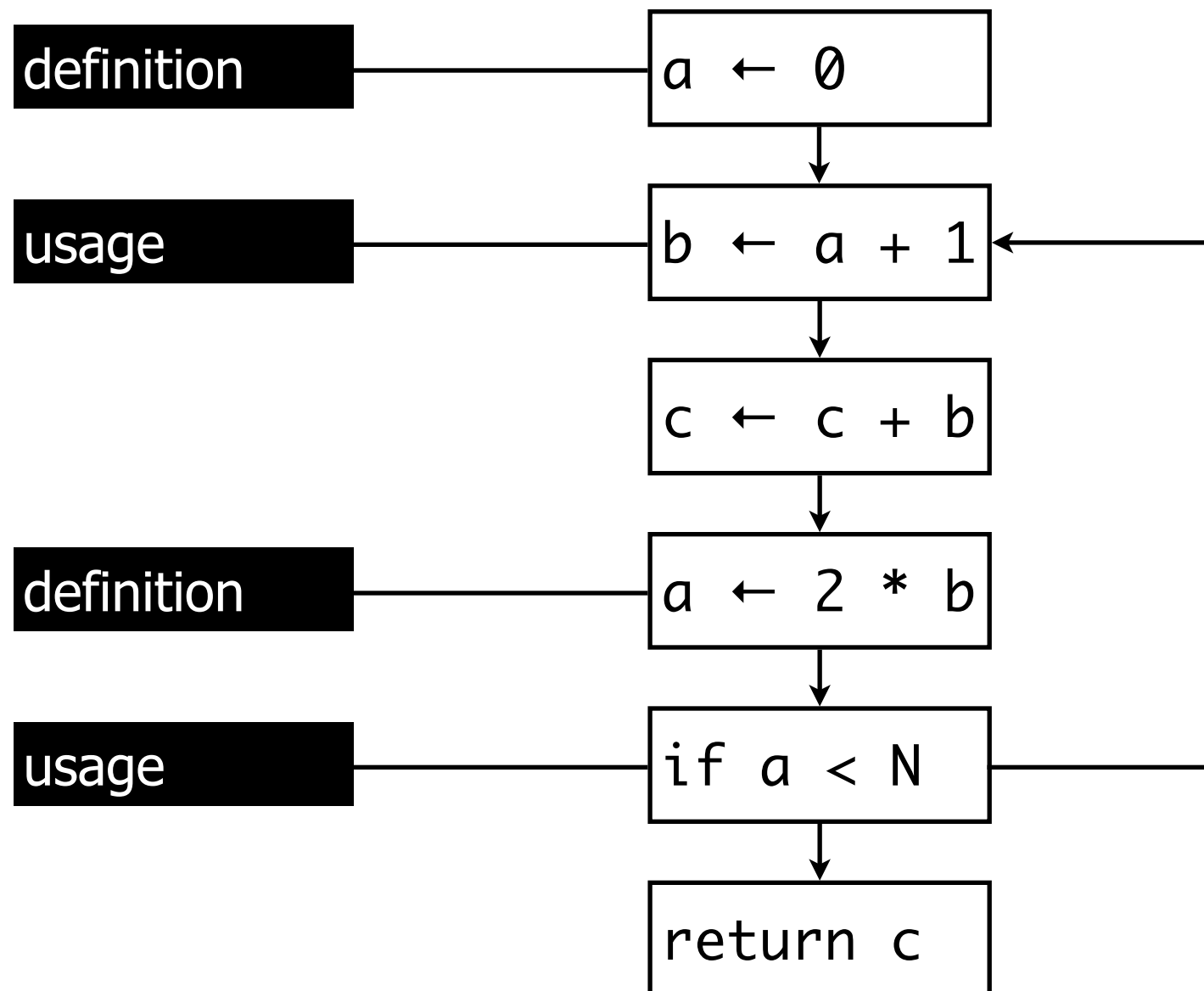
# Liveness analysis

## terminology



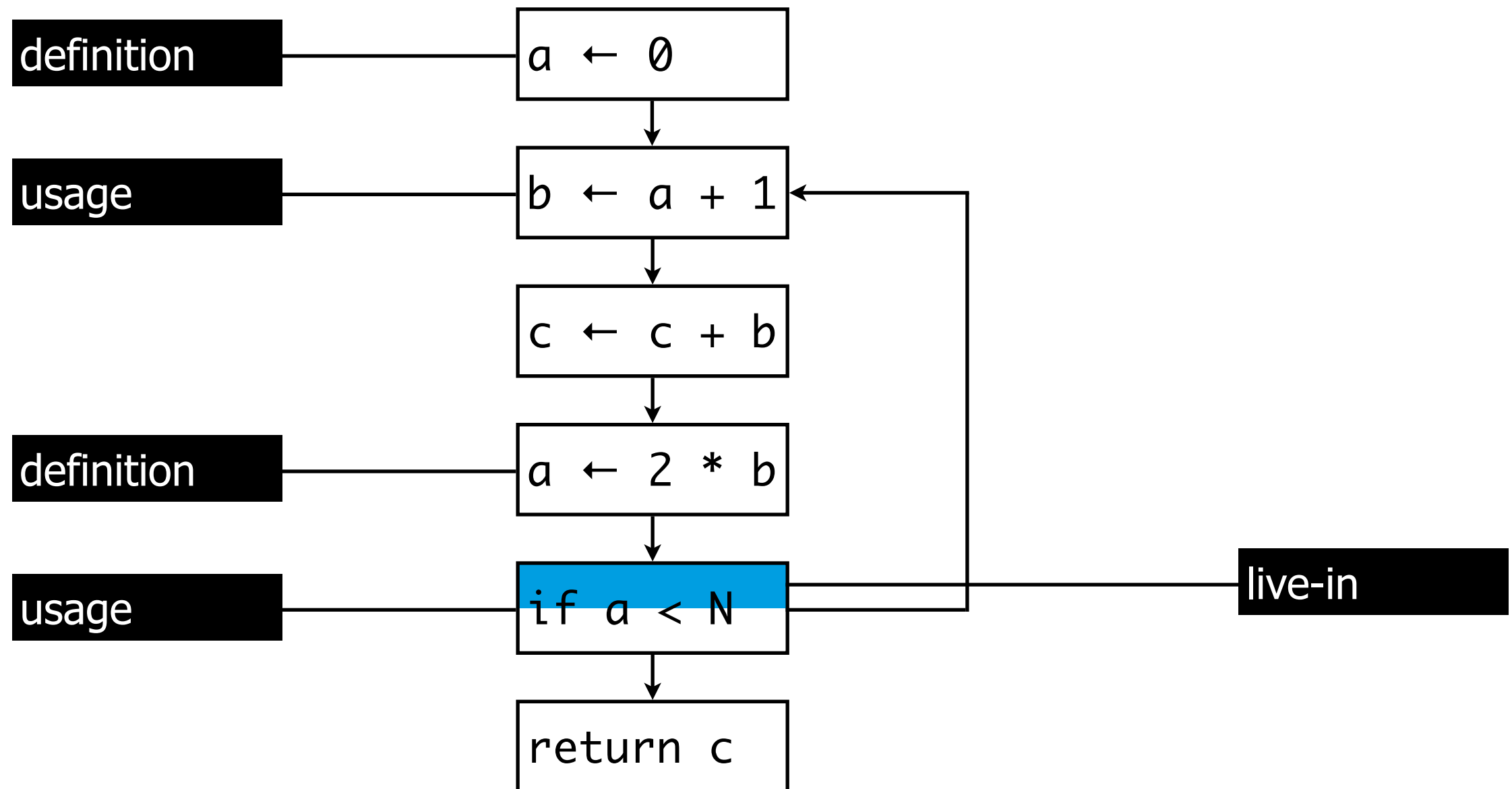
# Liveness analysis

## terminology



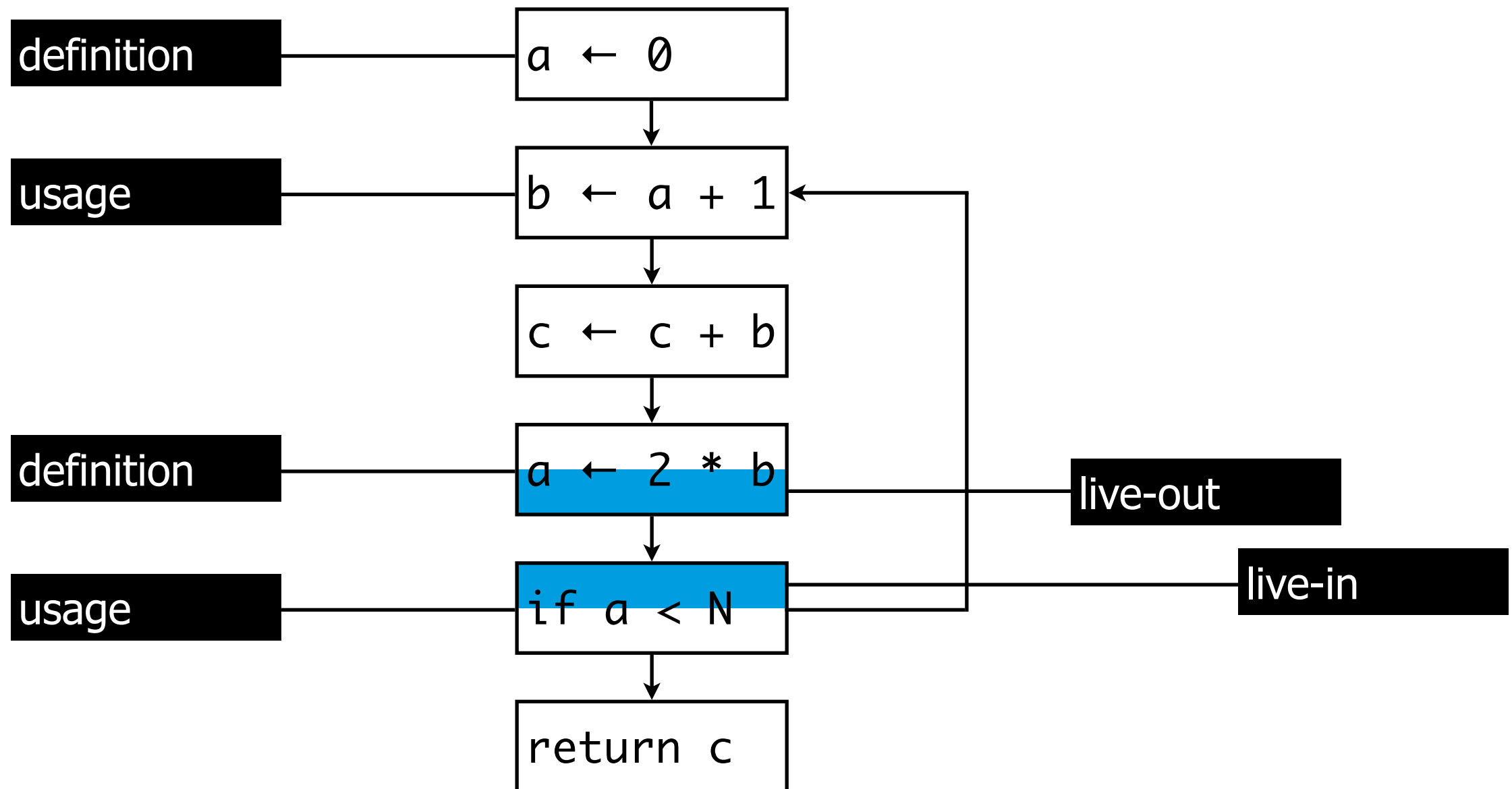
# Liveness analysis

## terminology



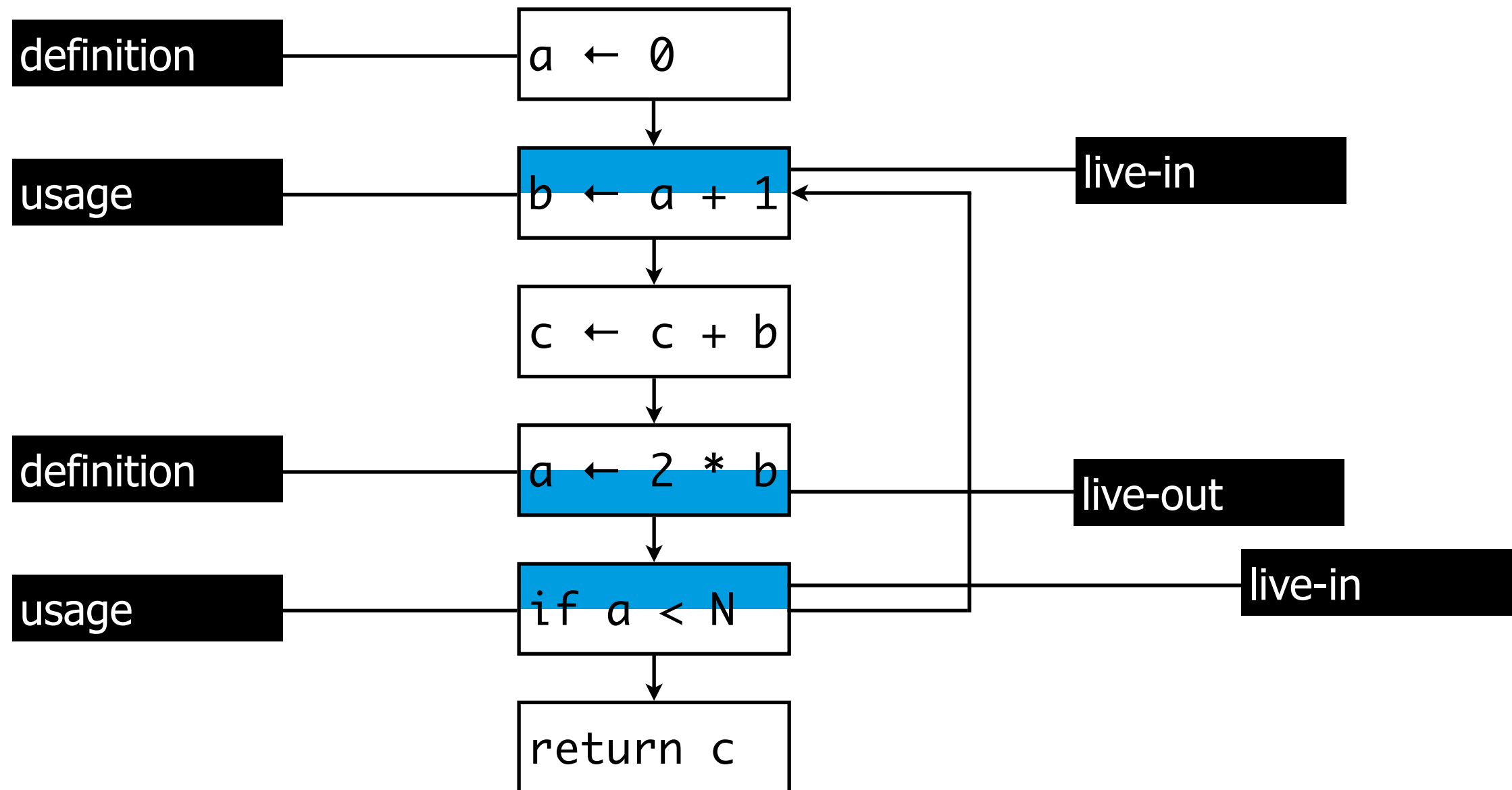
# Liveness analysis

## terminology



# Liveness analysis

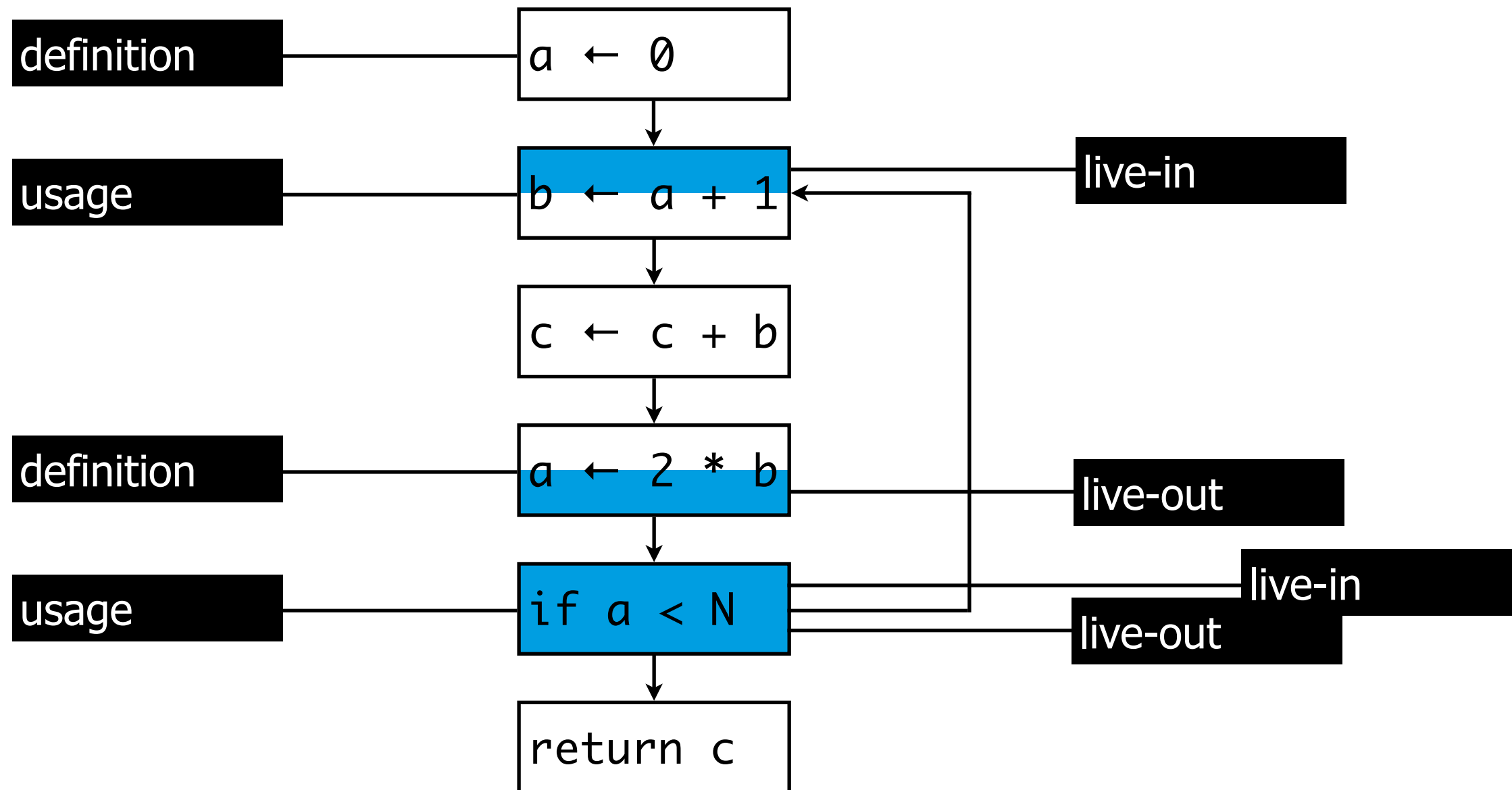
## terminology





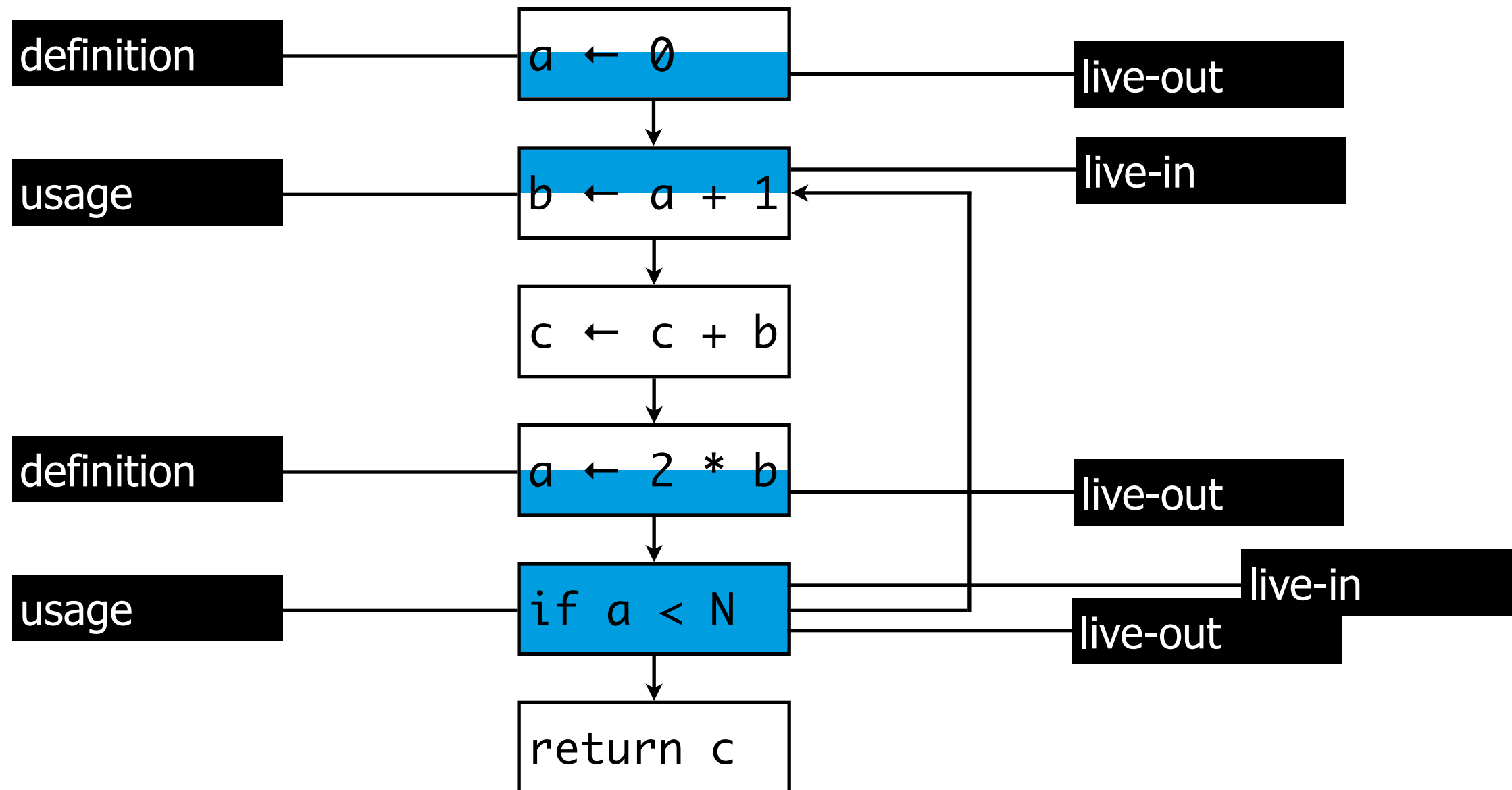
# Liveness analysis

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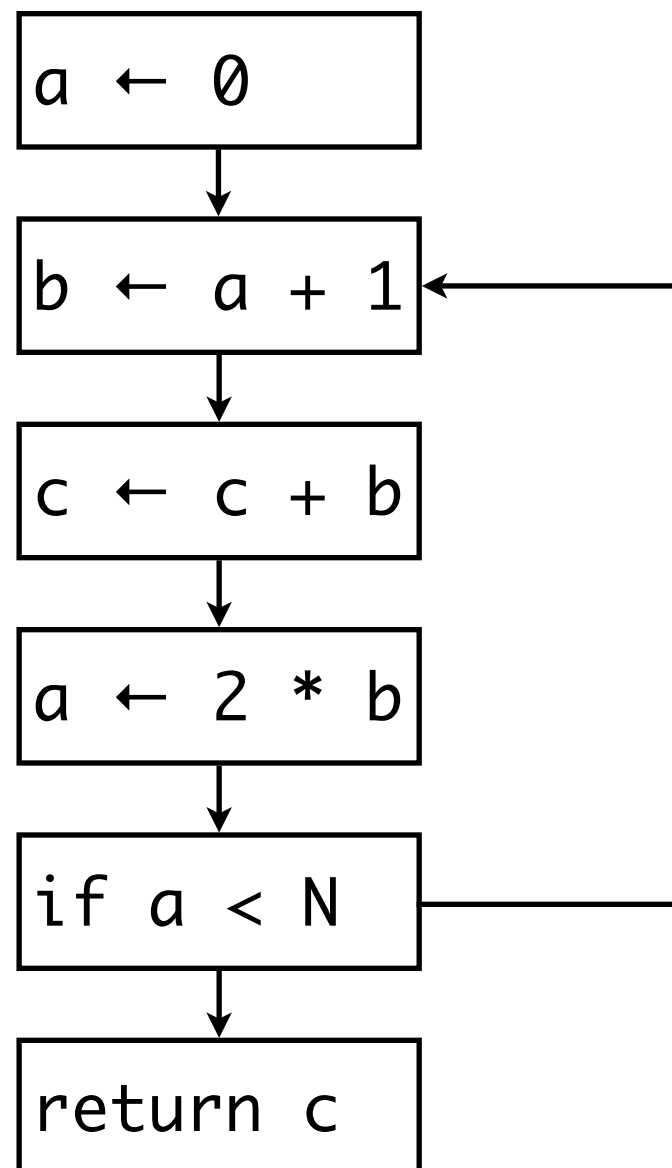
# Liveness analysis

## terminology



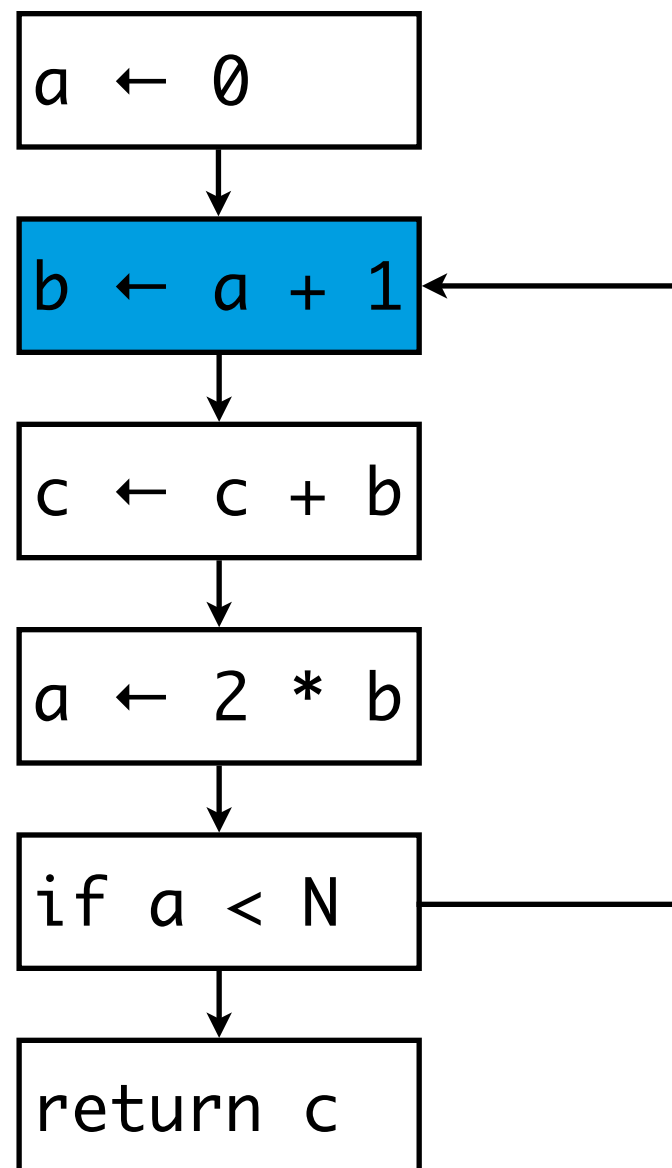
# Liveness analysis

## example



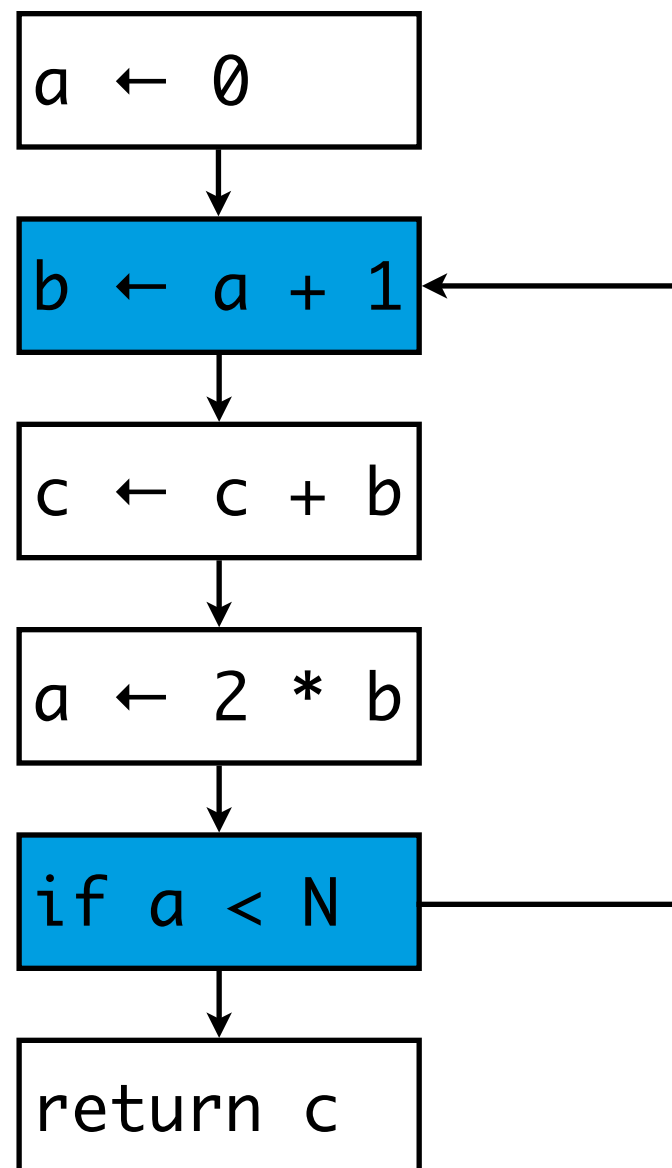
# Liveness analysis

## example



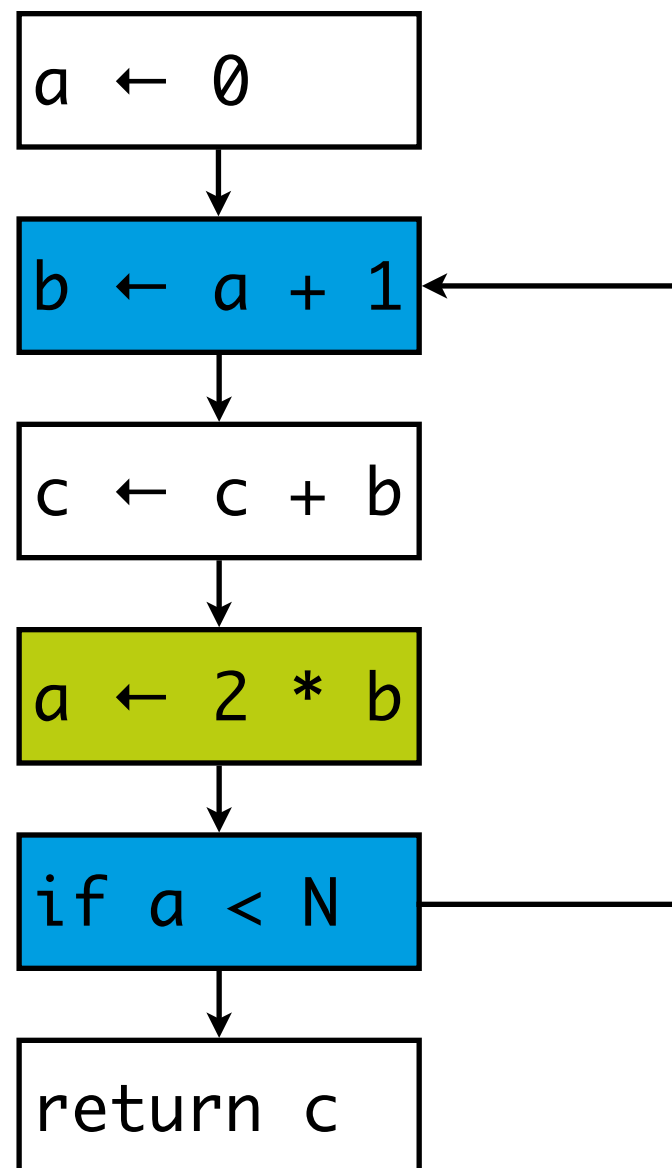
# Liveness analysis

## example



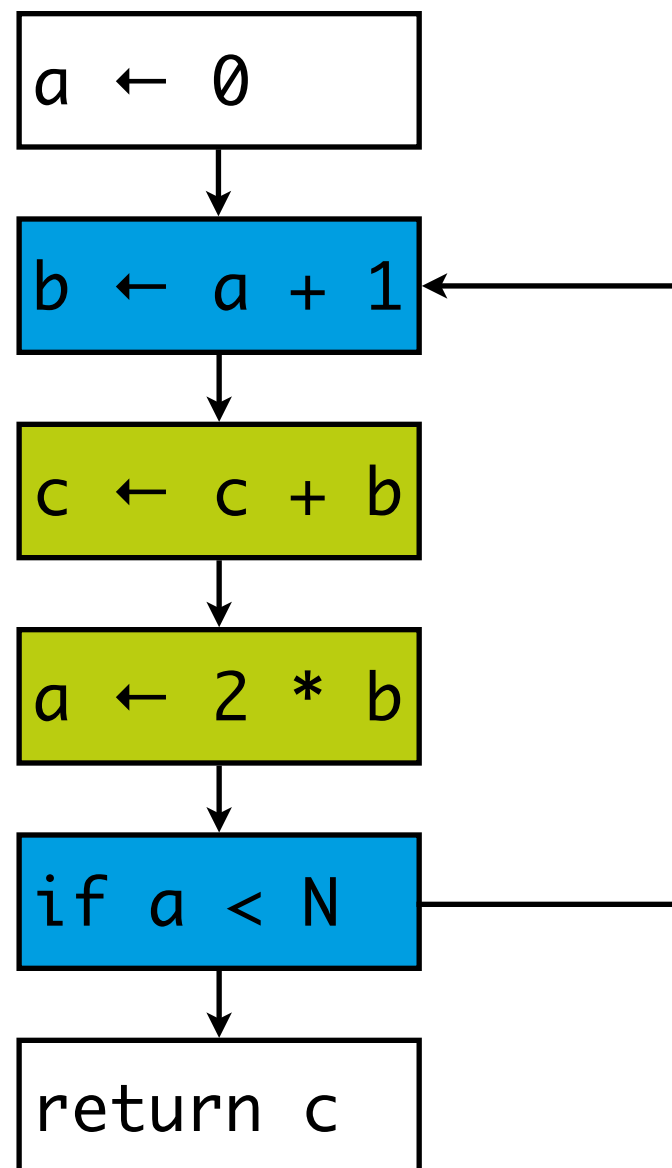
# Liveness analysis

## example



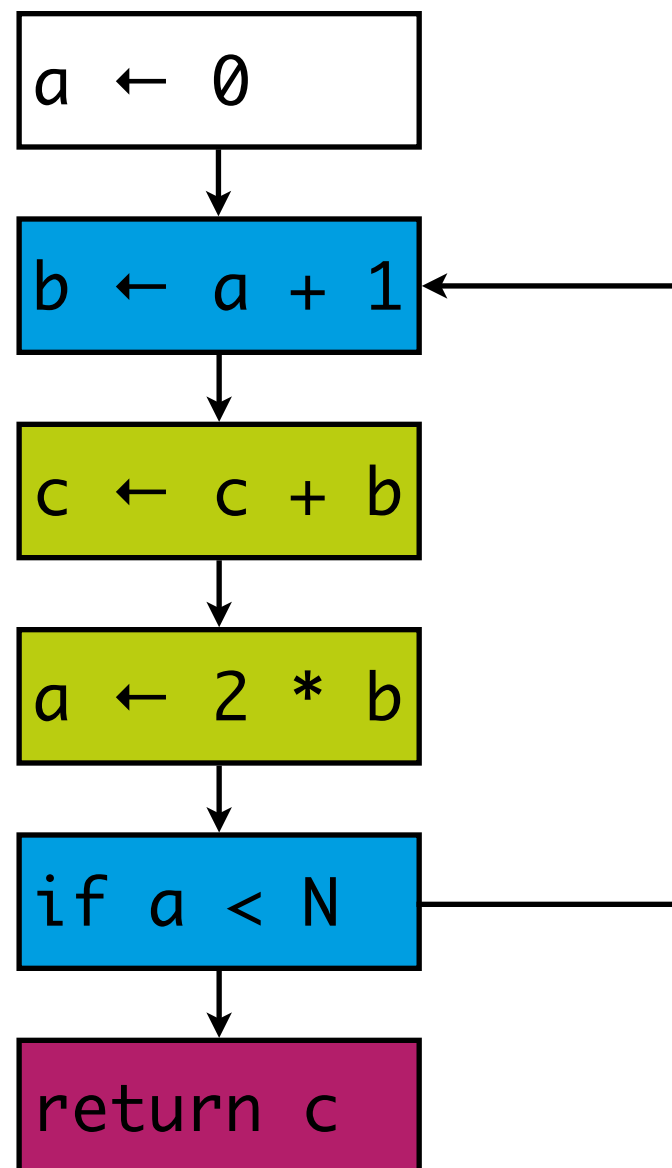
# Liveness analysis

## example



# Liveness analysis

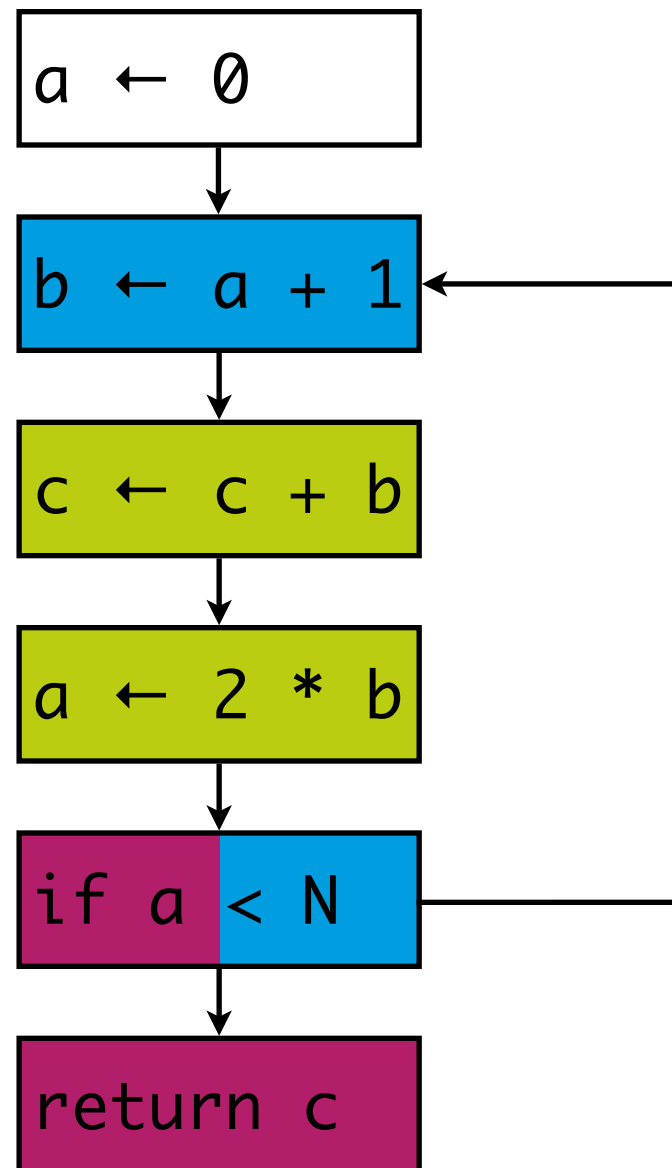
## example





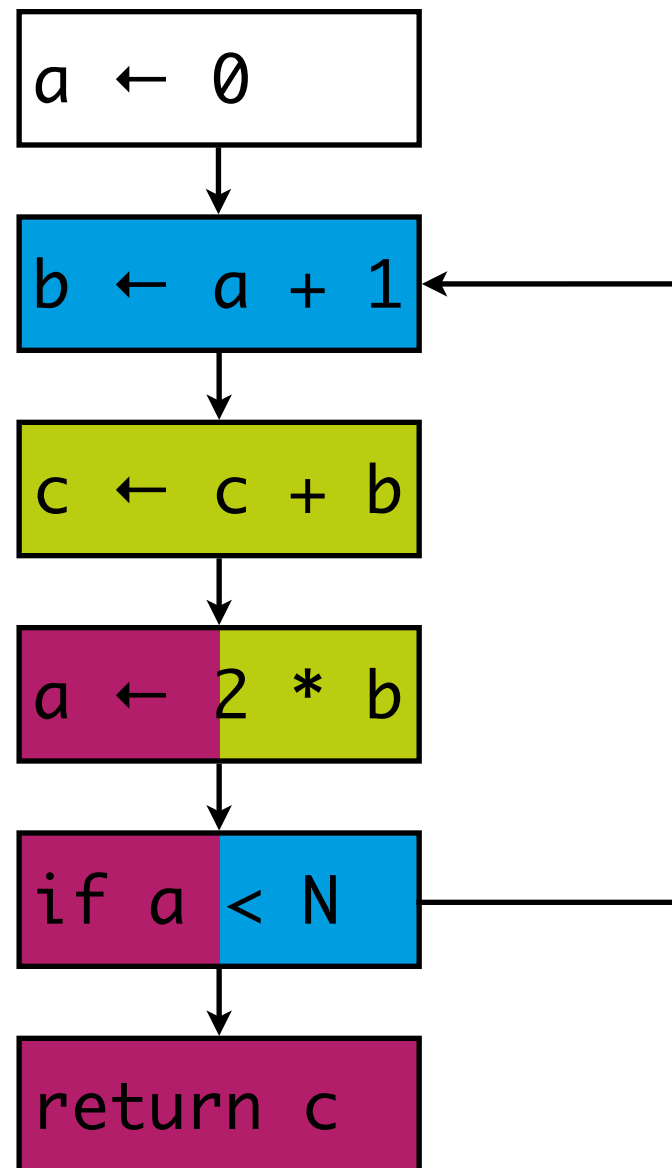
# Liveness analysis

## example



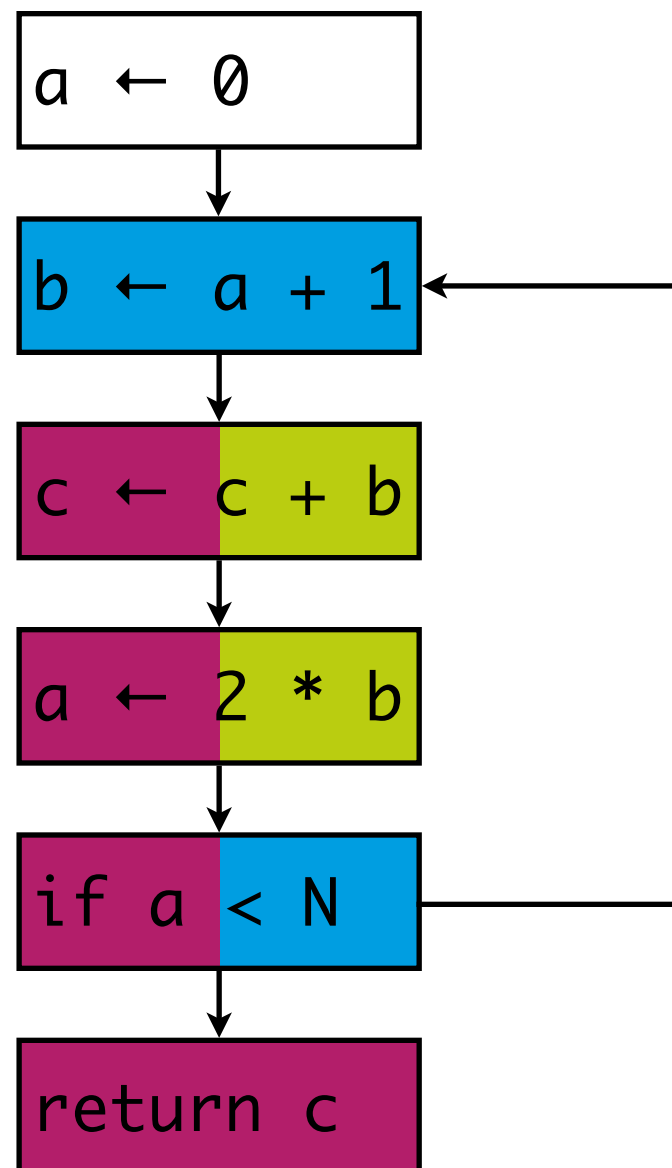
# Liveness analysis

## example



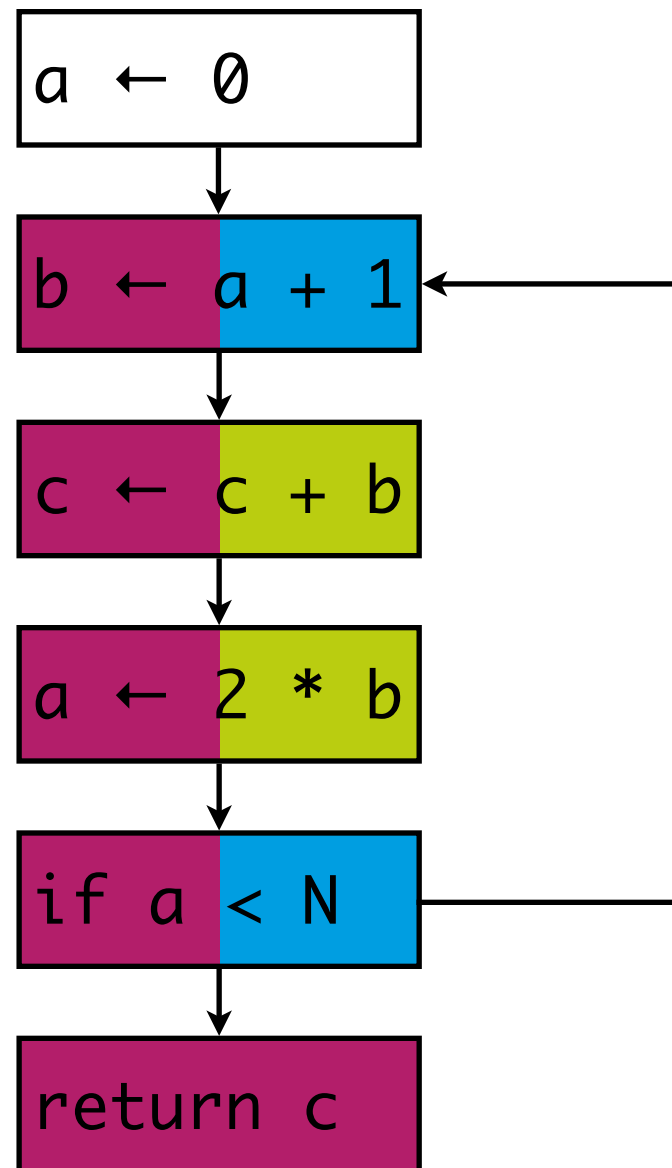
# Liveness analysis

## example



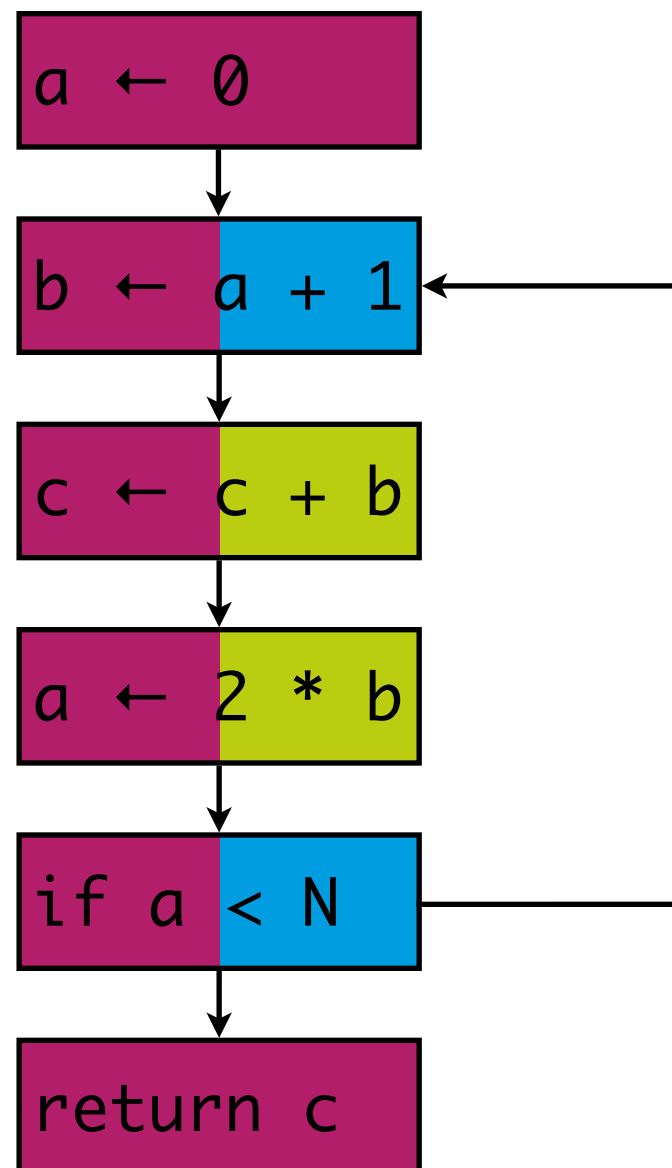
# Liveness analysis

## example



# Liveness analysis

## example



# Liveness analysis

## formalisation

$$\text{in}[n] = \text{use}[n] \cup (\text{out}[n] - \text{def}[n])$$

$$\text{out}[n] = \bigcup_{s \in \text{succ}[n]} \text{in}[s]$$

1. If a variable is **used** at node **n**, then it is live-**in** at **n**.
2. If a variable is live-**out** but not **defined** at node **n**, it is live-**in** at **n**.
3. If a variable is live-**in** at node **n**, then it is live-**out** at its **predecessors**.

# Liveness analysis algorithm

for each  $n$

$in[n] \leftarrow \{\}$  ;  $out[n] \leftarrow \{\}$

repeat

for each  $n$

$in'[n] = in[n]$  ;  $out'[n] = out[n]$

$in[n] = use[n] \cup (out[n] - def[n])$

for each  $s$  in  $succ[n]$

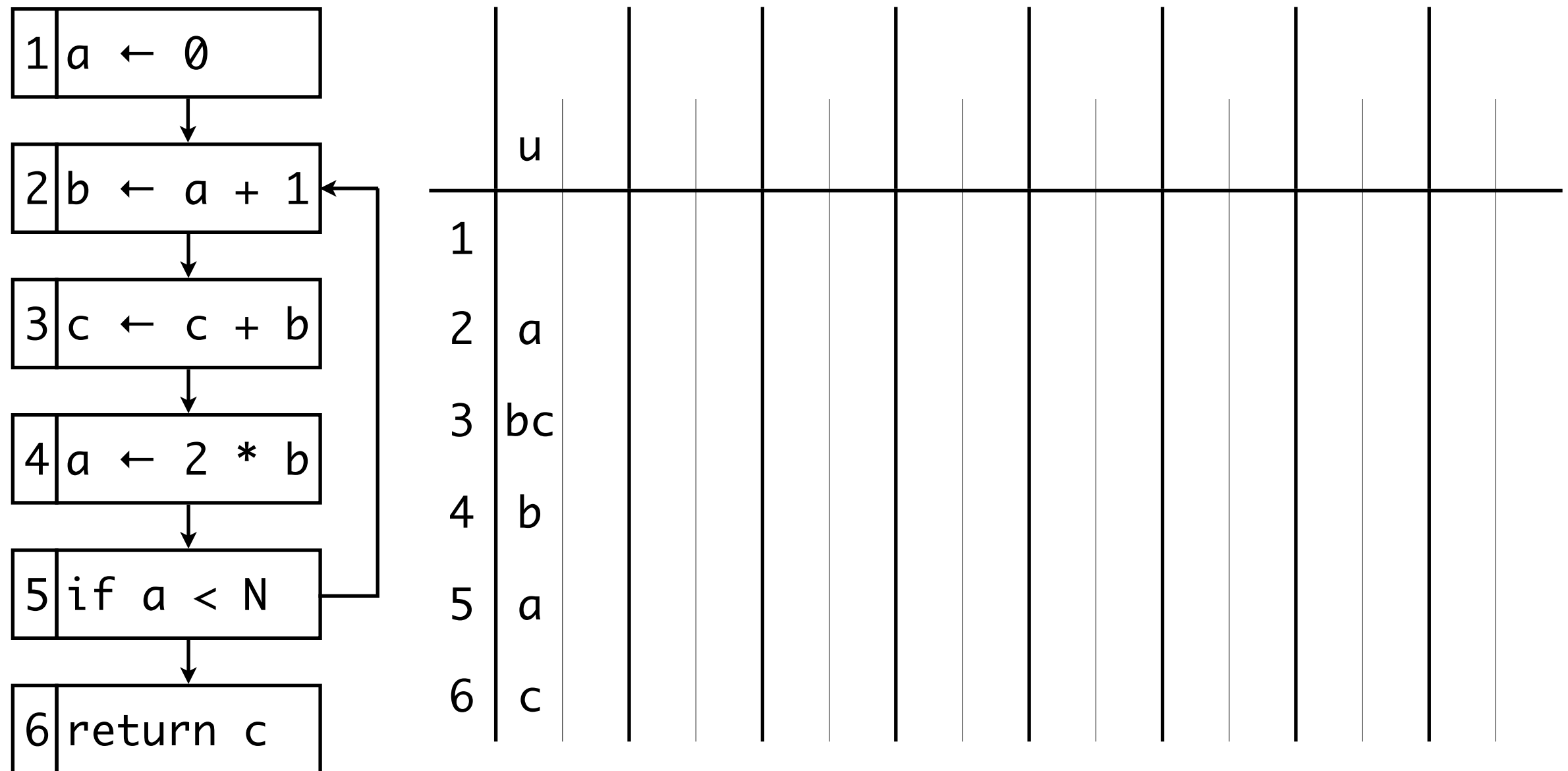
$out[n] = out[n] \cup in[s]$

until

for all  $n$ :  $in[n] = in'[n]$  and  $out[n] = out'[n]$

# Liveness analysis

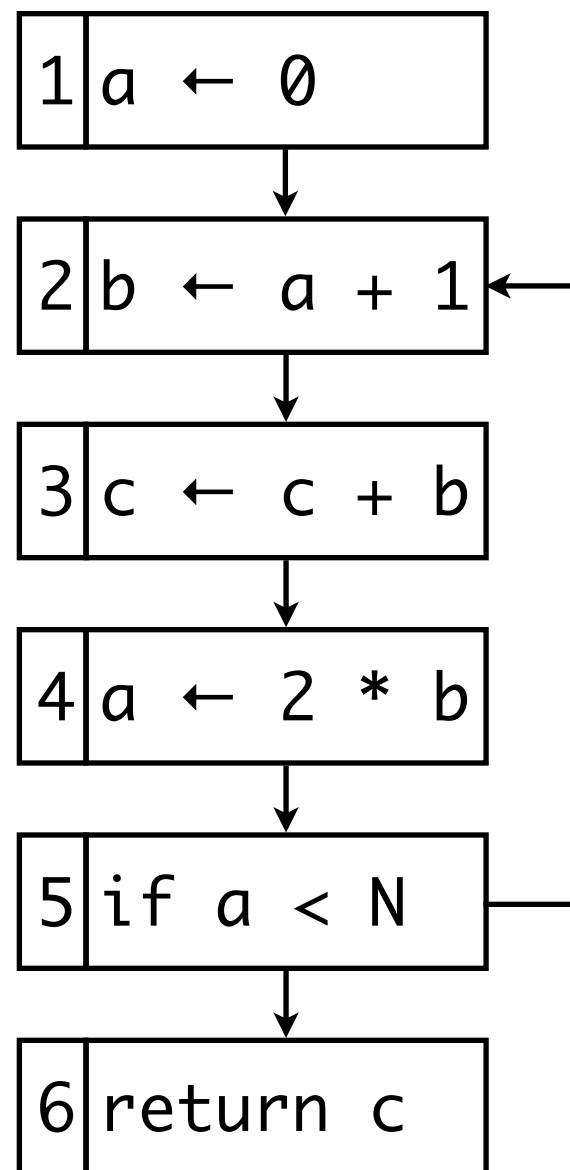
## example





# Liveness analysis

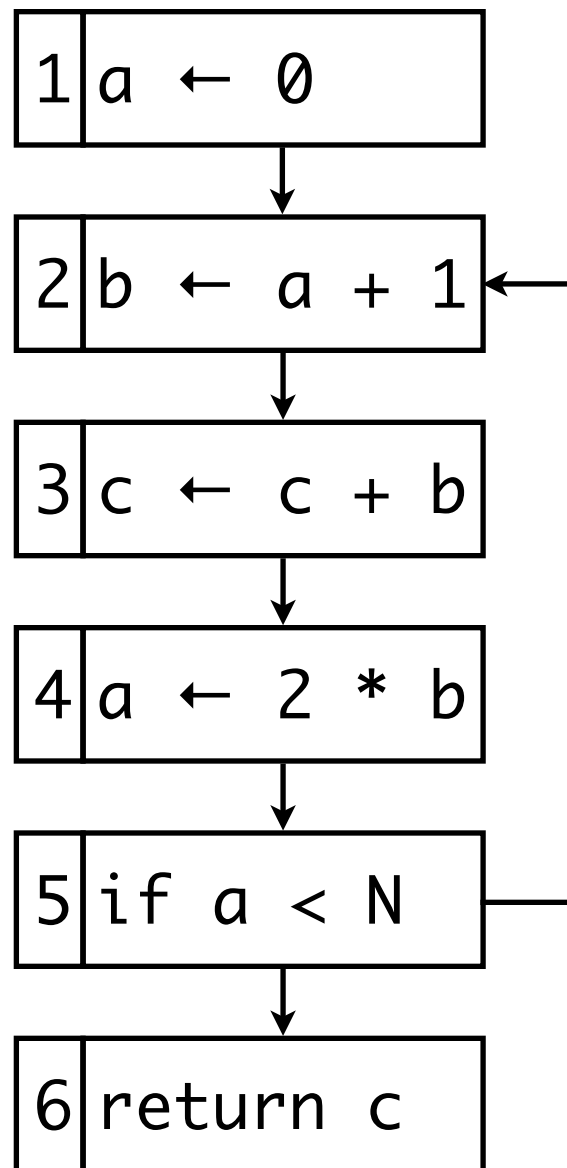
## example



	u	d																	
1		a																	
2	a	b																	
3	bc	c																	
4	b	a																	
5	a																		
6	c																		

# Liveness analysis

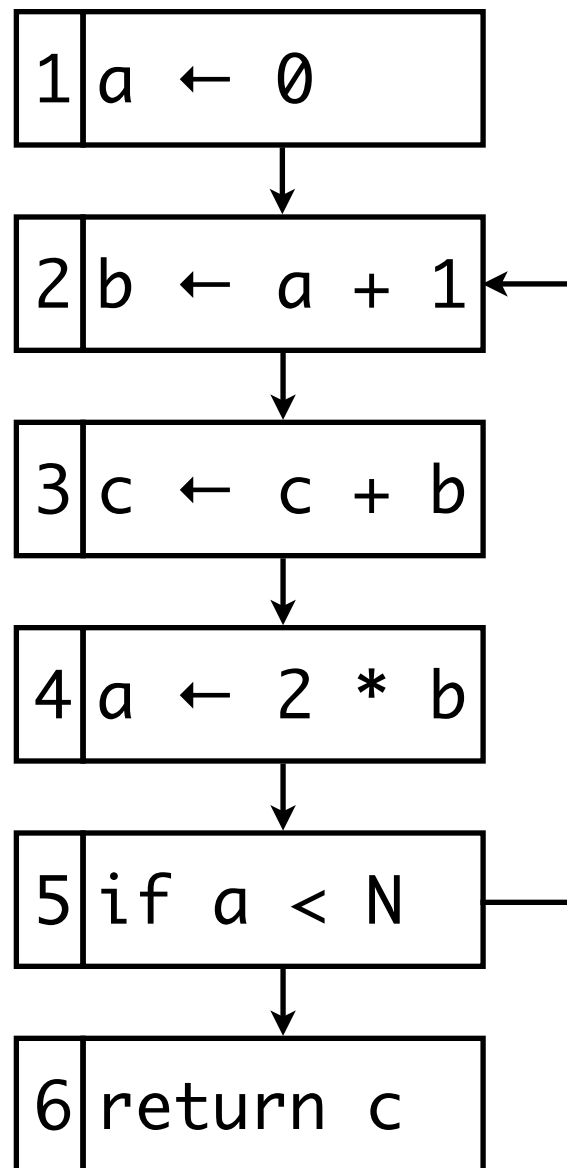
## example



	u	d	i	o															
1		a																	
2	a	b	a																
3	bc	c	bc																
4	b	a	b																
5	a		a	a															
6	c		c																

# Liveness analysis

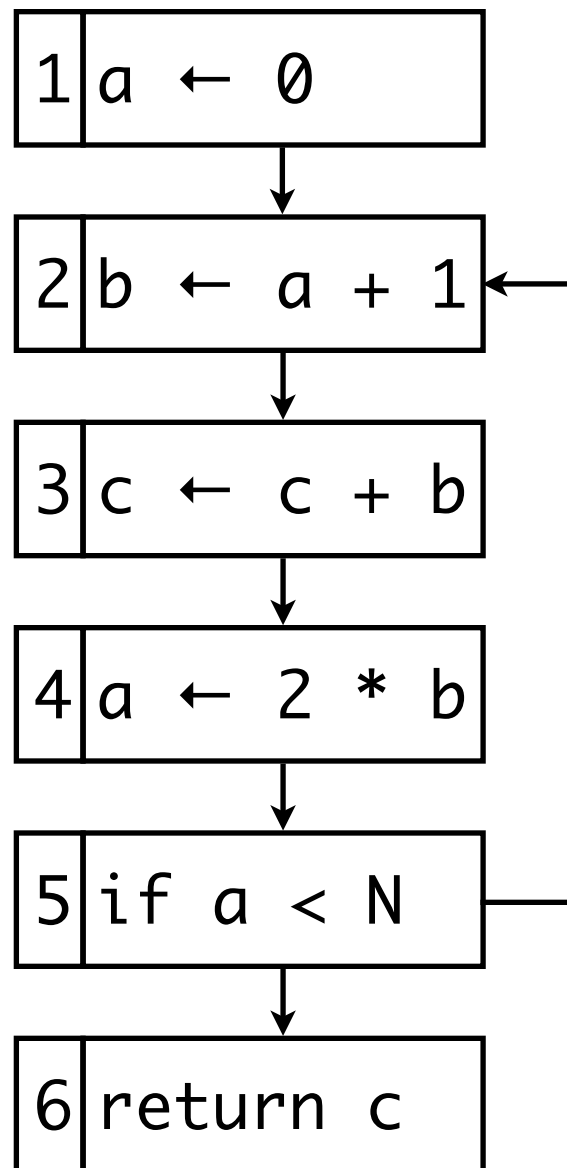
## example



			1		2											
	u	d	i	o	i	o										
1		a				a										
2	a	b	a		a	bc										
3	bc	c	bc		bc	b										
4	b	a	b		b	a										
5	a		a	a	a	ac										
6	c		c		c											

# Liveness analysis

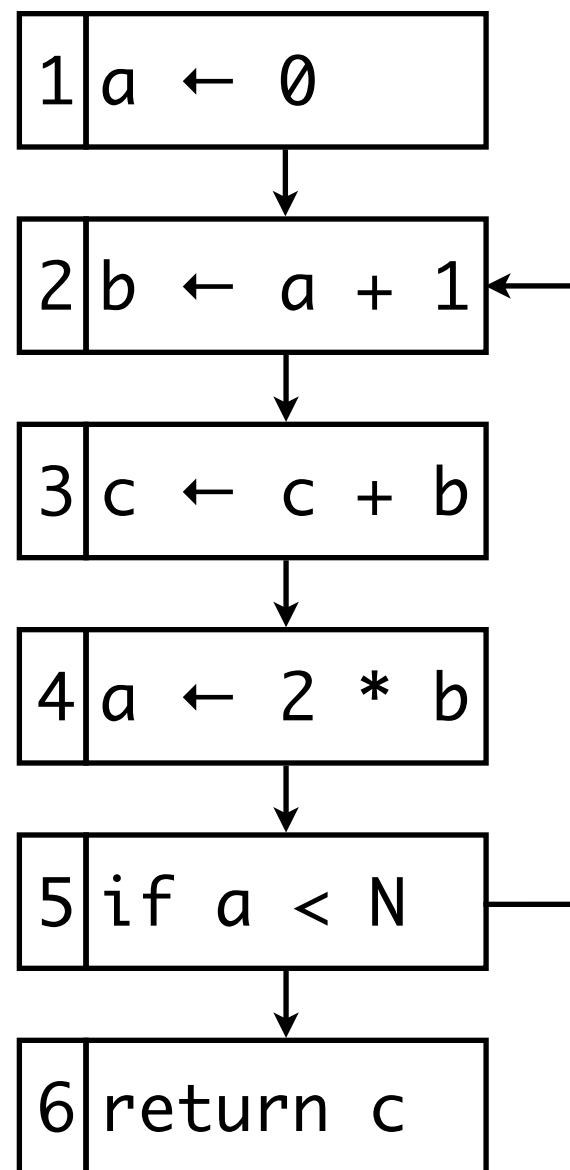
## example



			1		2		3							
	u	d	i	o	i	o	i	o						
1		a				a		a						
2	a	b	a		a	bc	ac	bc						
3	bc	c	bc		bc	b	bc	b						
4	b	a	b		b	a	b	a						
5	a		a	a	a	ac	ac	ac						
6	c		c		c		c							

# Liveness analysis

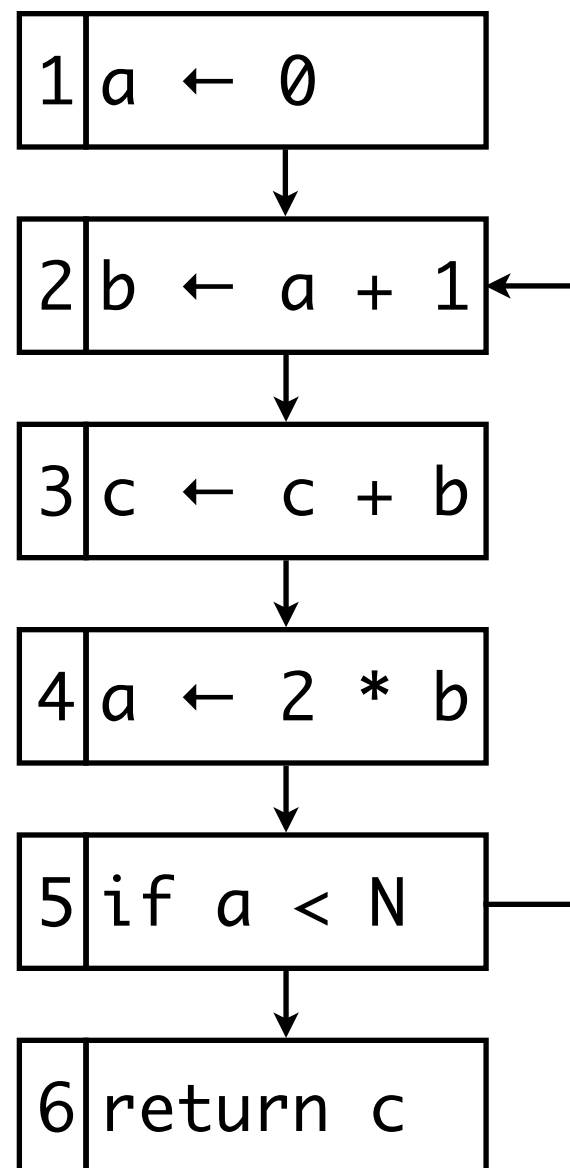
## example



			1		2		3		4						
	u	d	i	o	i	o	i	o	i	o					
1		a				a		a		ac					
2	a	b	a		a	bc	ac	bc	ac	bc					
3	bc	c	bc		bc	b	bc	b	bc	b					
4	b	a	b		b	a	b	a	b	ac					
5	a		a	a	a	ac	ac	ac	ac	ac					
6	c		c		c		c		c						

# Liveness analysis

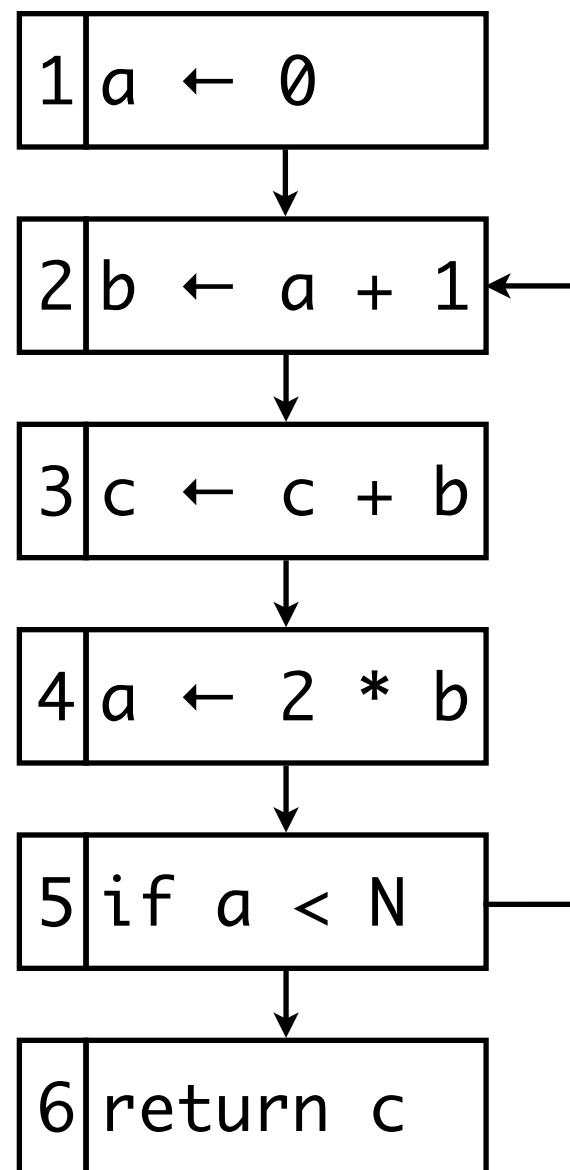
## example



			1		2		3		4		5				
	u	d	i	o	i	o	i	o	i	o	i	o			
1		a				a		a		ac	c	ac			
2	a	b	a		a	bc	ac	bc	ac	bc	ac	bc			
3	bc	c	bc		bc	b	bc	b	bc	b	bc	b			
4	b	a	b		b	a	b	a	b	ac	bc	ac			
5	a		a	a	a	ac	ac	ac	ac	ac	ac	ac			
6	c		c		c		c		c		c				

# Liveness analysis

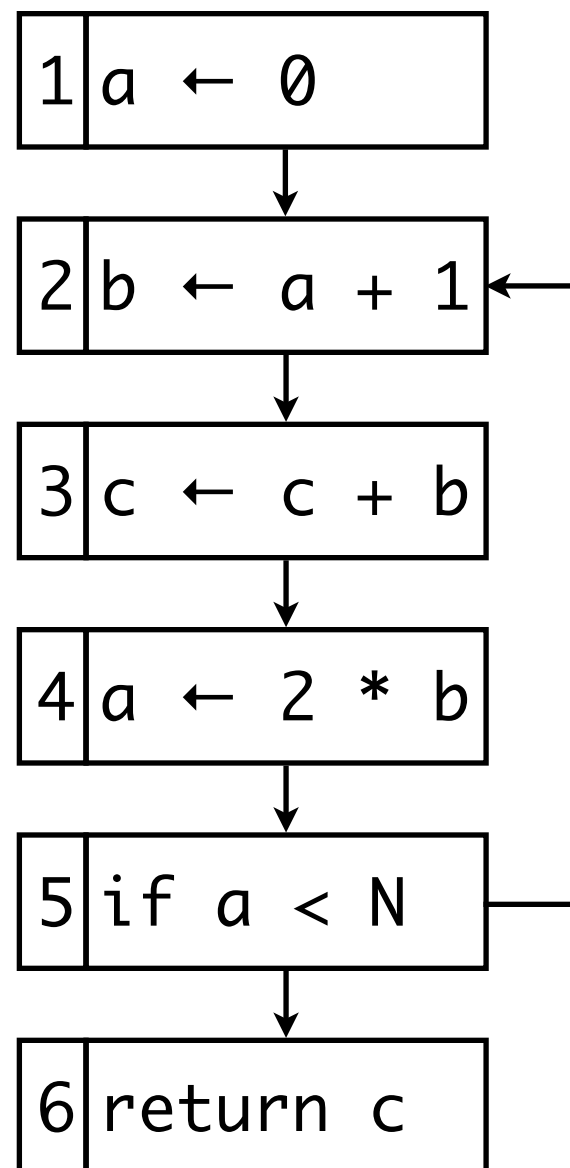
## example



			1		2		3		4		5		6		
	u	d	i	o	i	o	i	o	i	o	i	o	i	o	
1		a				a		a		ac	c	ac	c	ac	
2	a	b	a		a	bc	ac	bc	ac	bc	ac	bc	ac	bc	
3	bc	c	bc		bc	b	bc	b	bc	b	bc	b	bc	bc	
4	b	a	b		b	a	b	a	b	ac	bc	ac	bc	ac	
5	a		a	a	a	ac	ac	ac	ac	ac	ac	ac	ac	ac	
6	c		c		c		c		c		c		c		

# Liveness analysis

## example

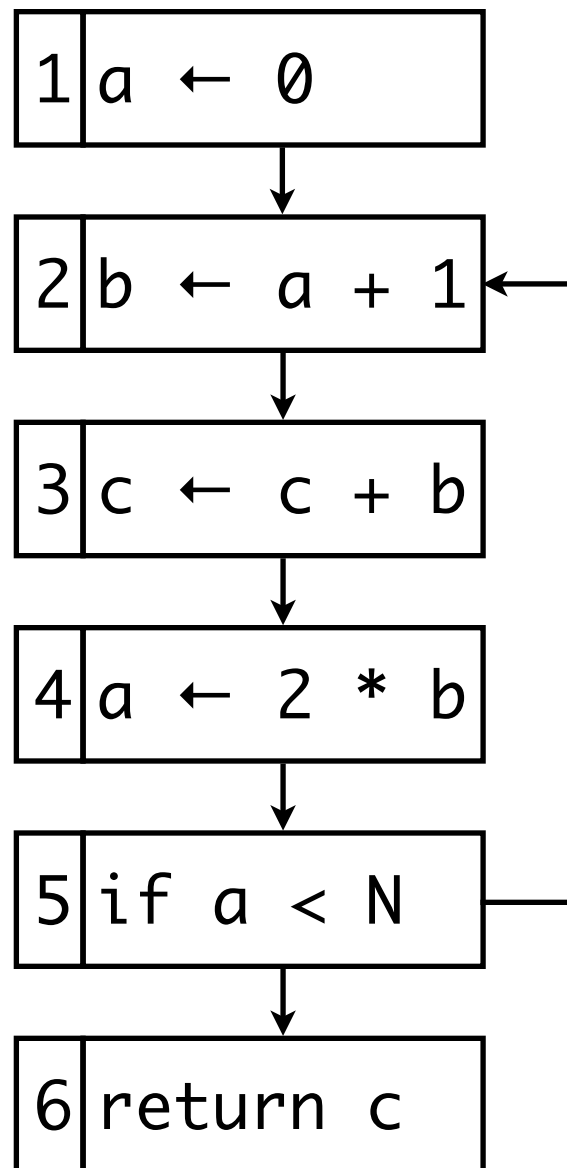


			1		2		3		4		5		6		7	
	u	d	i	o	i	o	i	o	i	o	i	o	i	o	i	o
1		a				a		a		ac	c	ac	c	ac	c	ac
2	a	b	a		a	bc	ac	bc	ac	bc	ac	bc	ac	bc	ac	bc
3	bc	c	bc		bc	b	bc	b	bc	b	bc	b	bc	bc	bc	bc
4	b	a	b		b	a	b	a	b	ac	bc	ac	bc	ac	bc	ac
5	a		a	a	a	ac	ac	ac	ac	ac	ac	ac	ac	ac	ac	ac
6	c		c		c		c		c		c		c		c	



# Liveness analysis

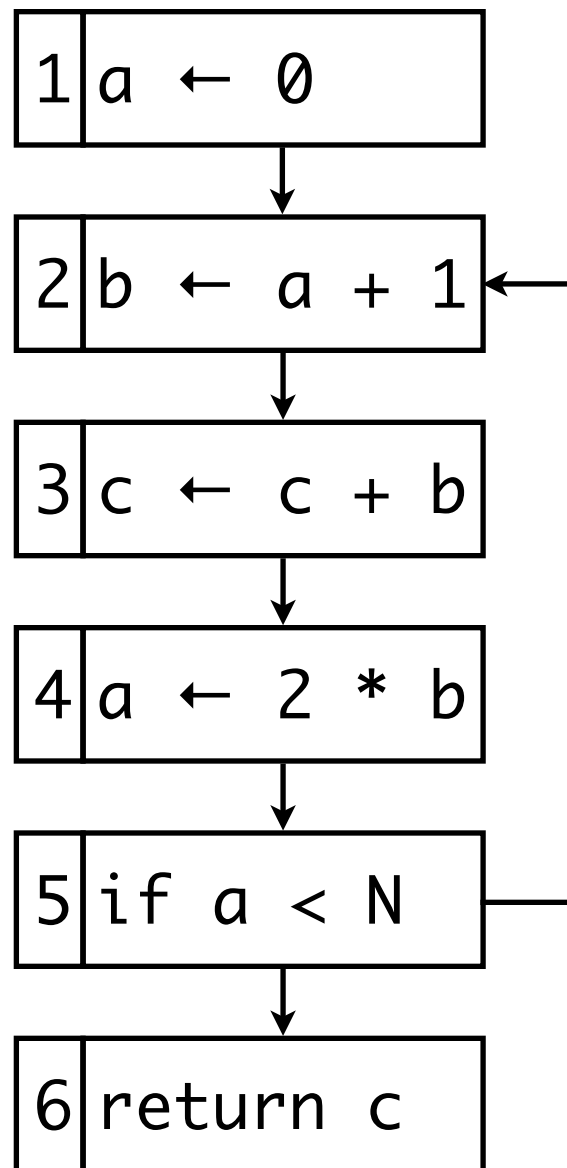
## optimisation



	u						
6	c						
5	a						
4	b						
3	bc						
2	a						
1							

# Liveness analysis

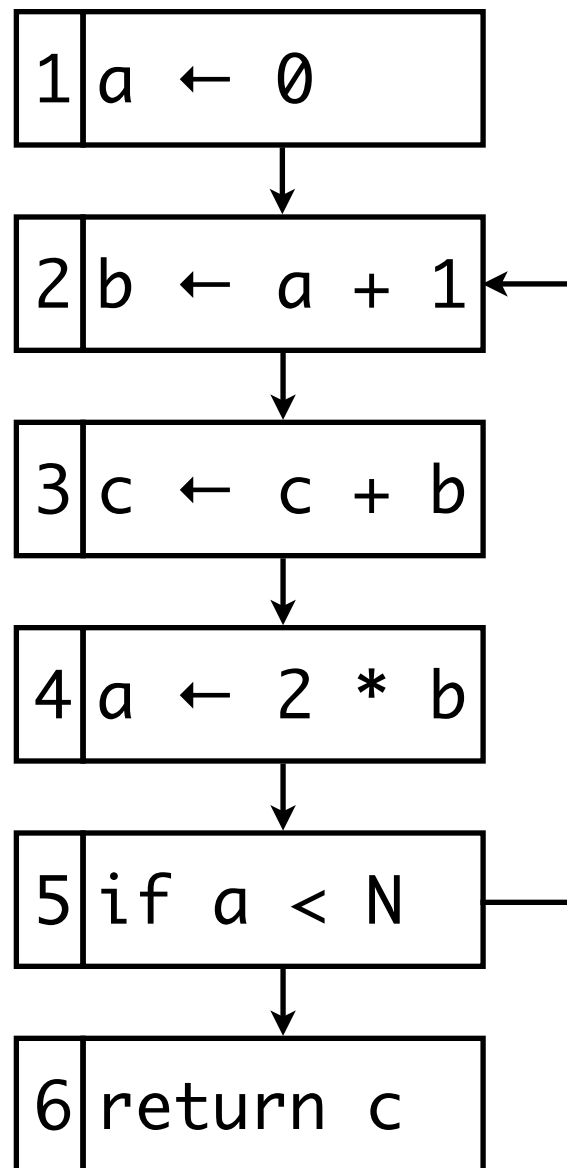
## optimisation



	u	d					
6	c						
5	a						
4	b	a					
3	bc	c					
2	a	b					
1		a					

# Liveness analysis

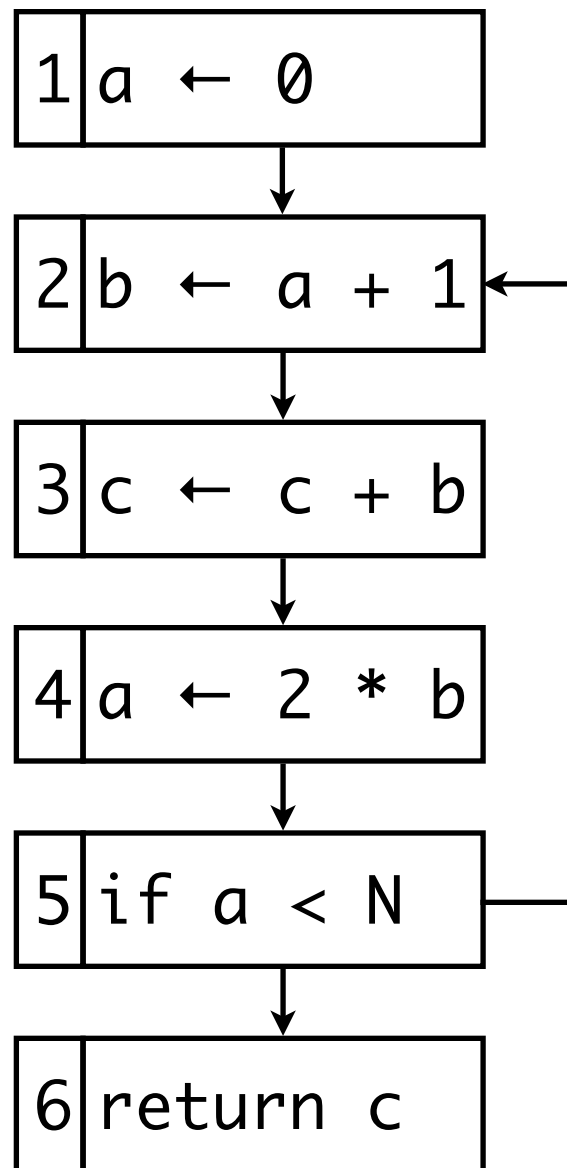
## optimisation



			1				
	u	d	o	i			
6	c			c			
5	a		c	ac			
4	b	a	ac	bc			
3	bc	c	bc	bc			
2	a	b	bc	ac			
1		a	ac	a			

# Liveness analysis

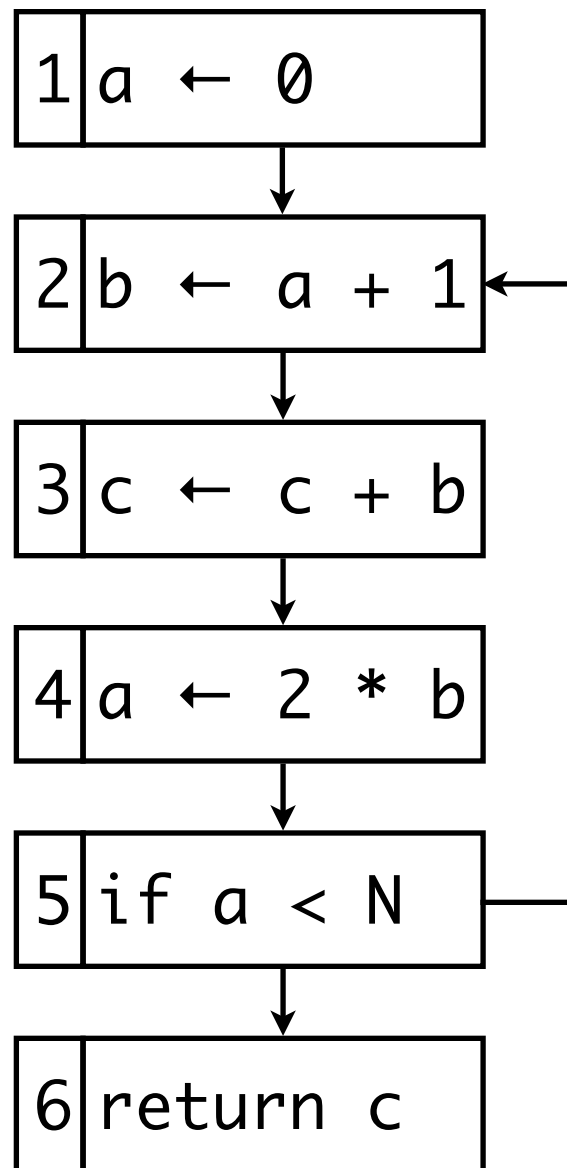
## optimisation



			1		2			
	u	d	o	i	o	i		
6	c			c		c		
5	a		c	ac	ac	ac		
4	b	a	ac	bc	ac	bc		
3	bc	c	bc	bc	bc	bc		
2	a	b	bc	ac	bc	ac		
1		a	ac	a	ac	c		

# Liveness analysis

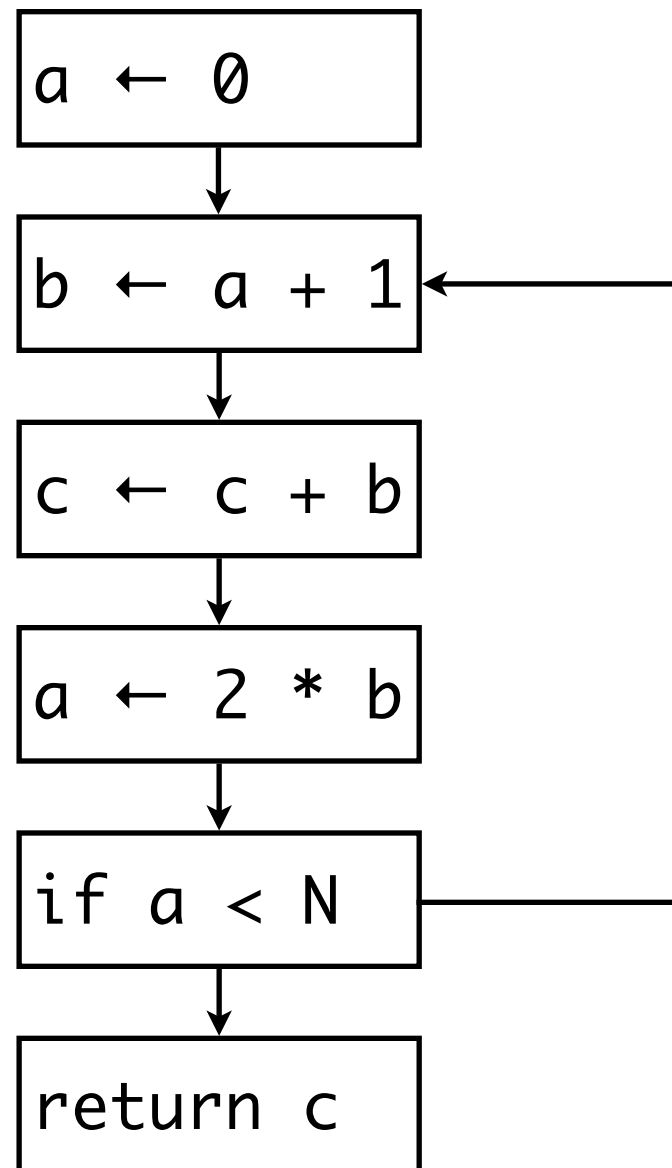
## optimisation



			1		2		3	
	u	d	o	i	o	i	o	i
6	c			c		c		c
5	a		c	ac	ac	ac	ac	ac
4	b	a	ac	bc	ac	bc	ac	bc
3	bc	c	bc	bc	bc	bc	bc	bc
2	a	b	bc	ac	bc	ac	bc	ac
1		a	ac	a	ac	c	ac	c

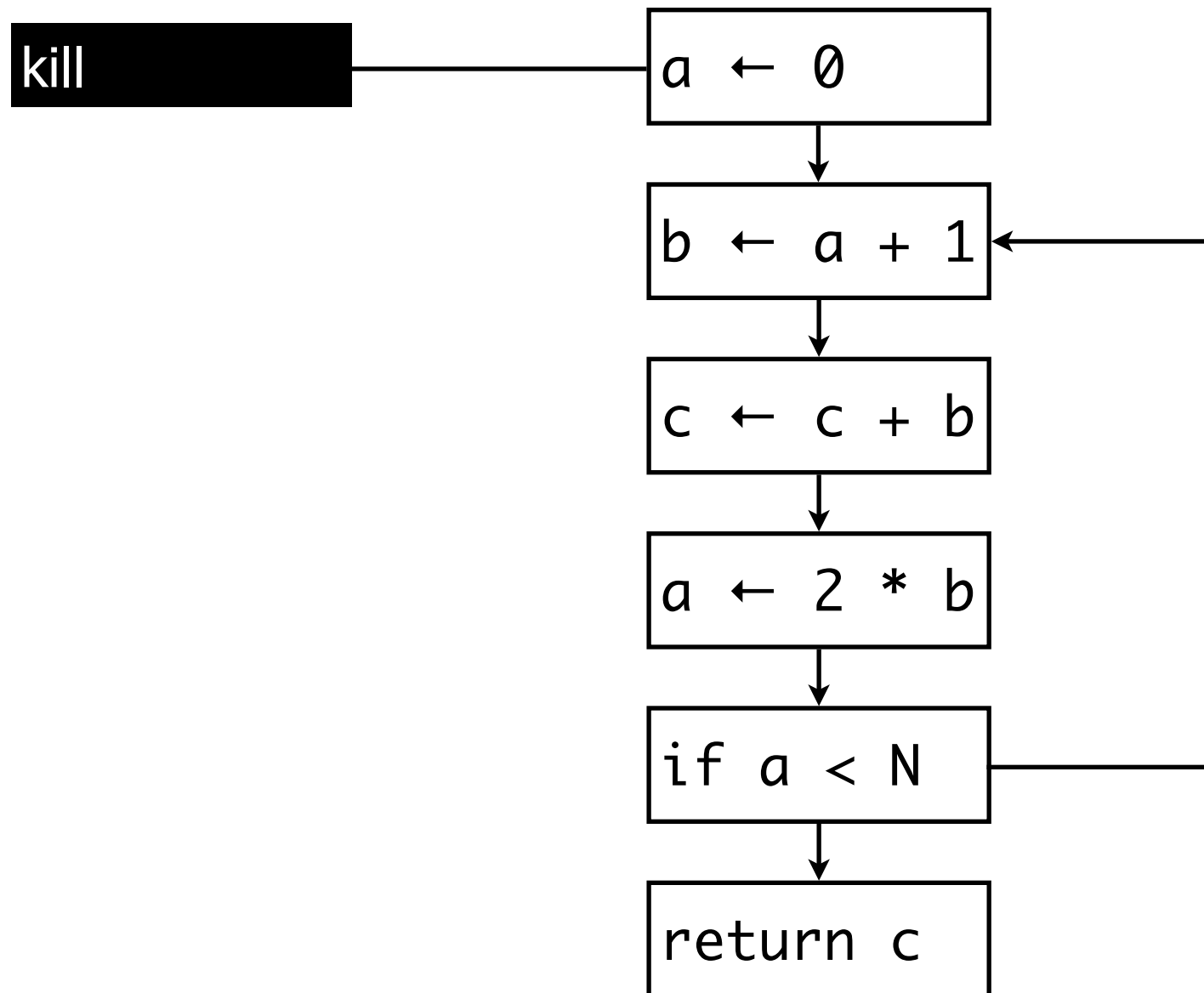
# Liveness analysis

## generalisation



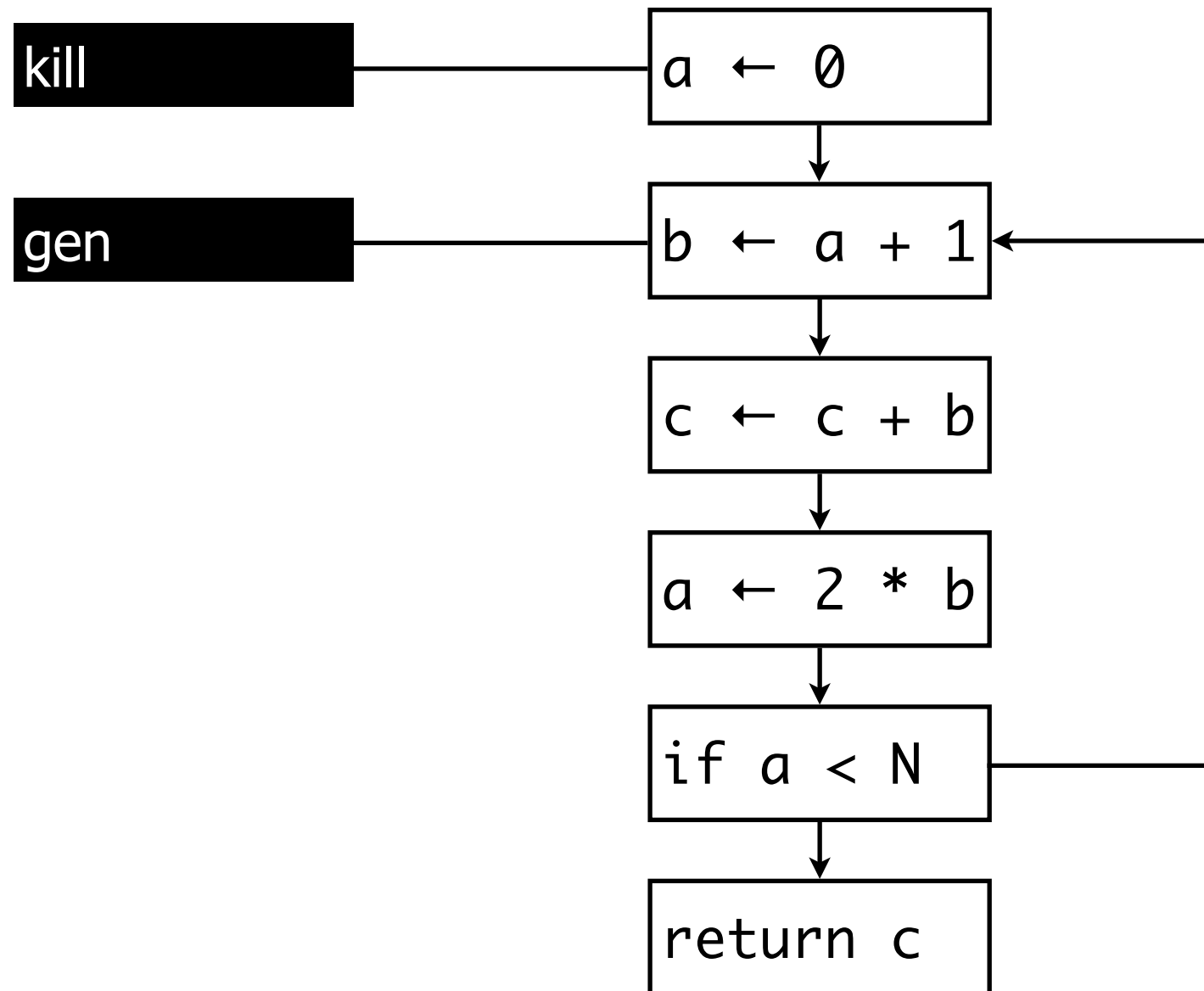
# Liveness analysis

## generalisation



# Liveness analysis

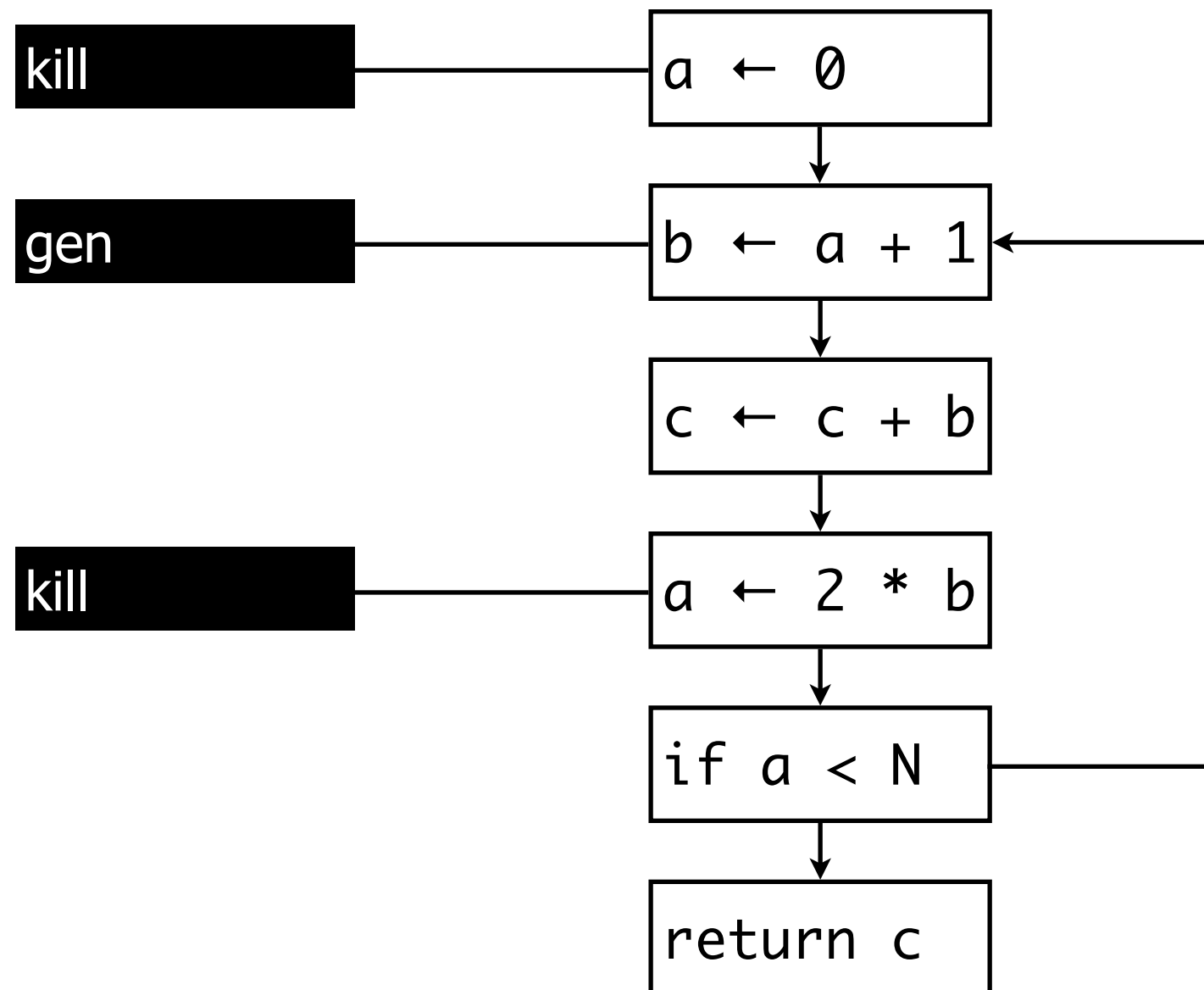
## generalisation





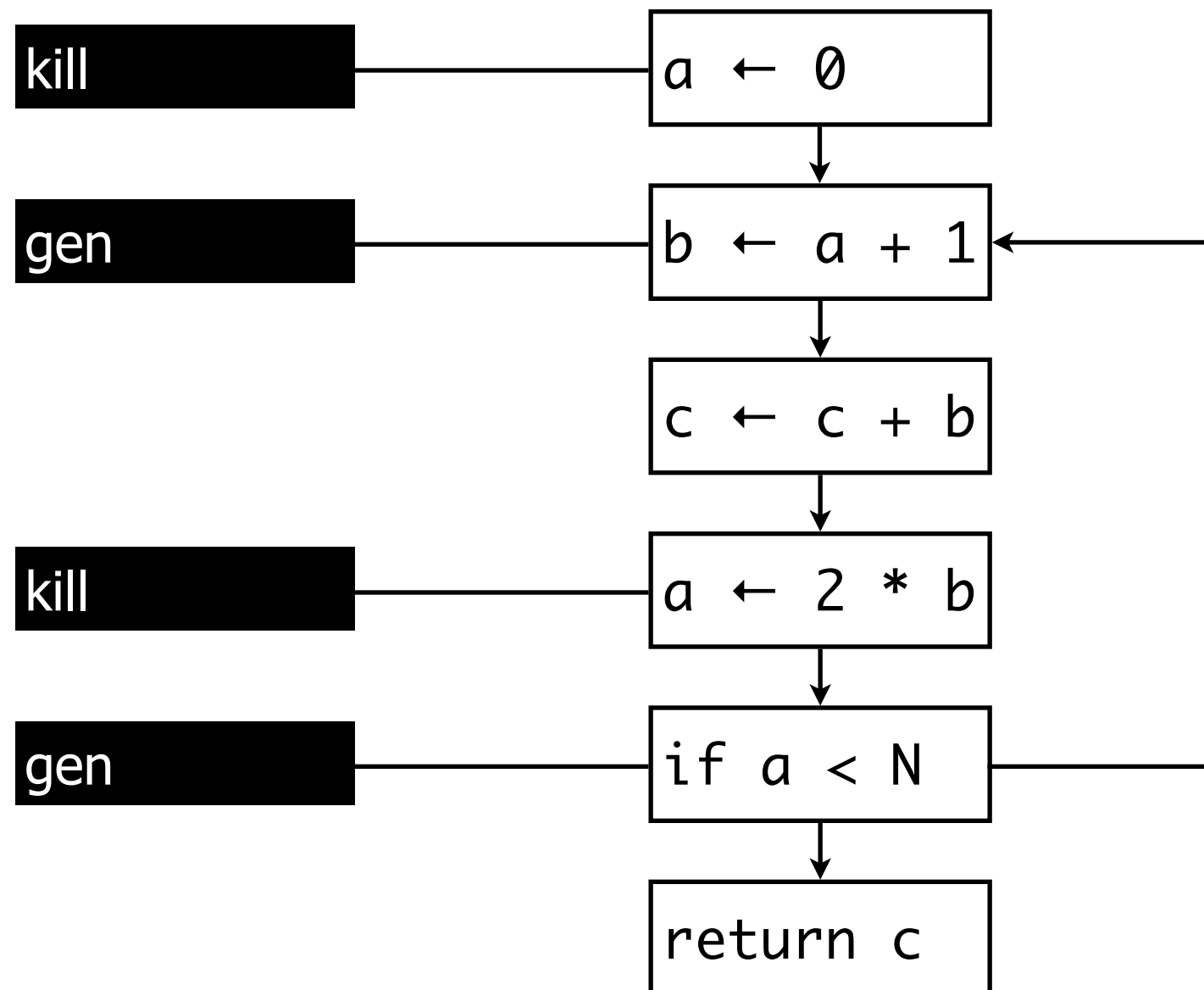
# Liveness analysis

## generalisation



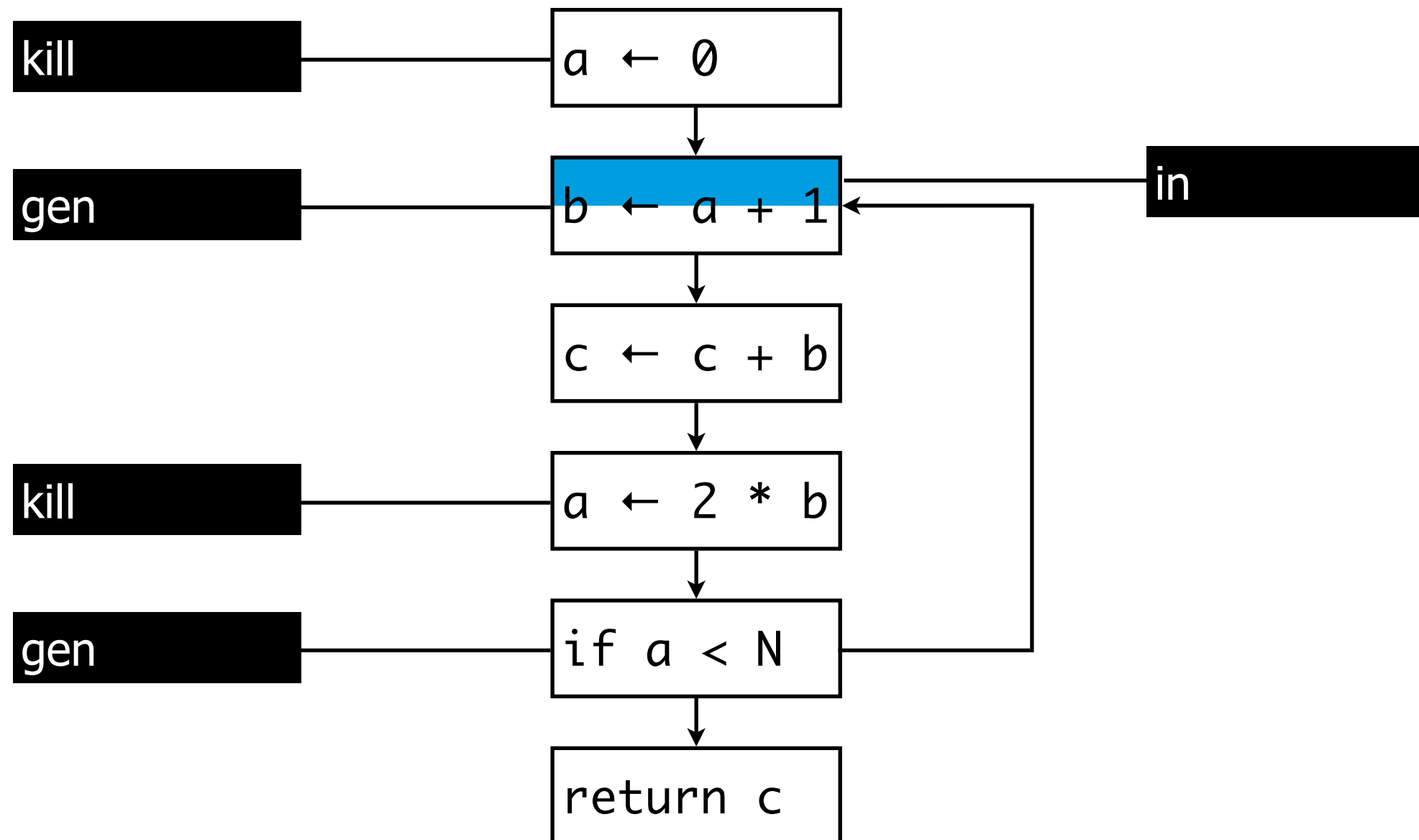
# Liveness analysis

## generalisation



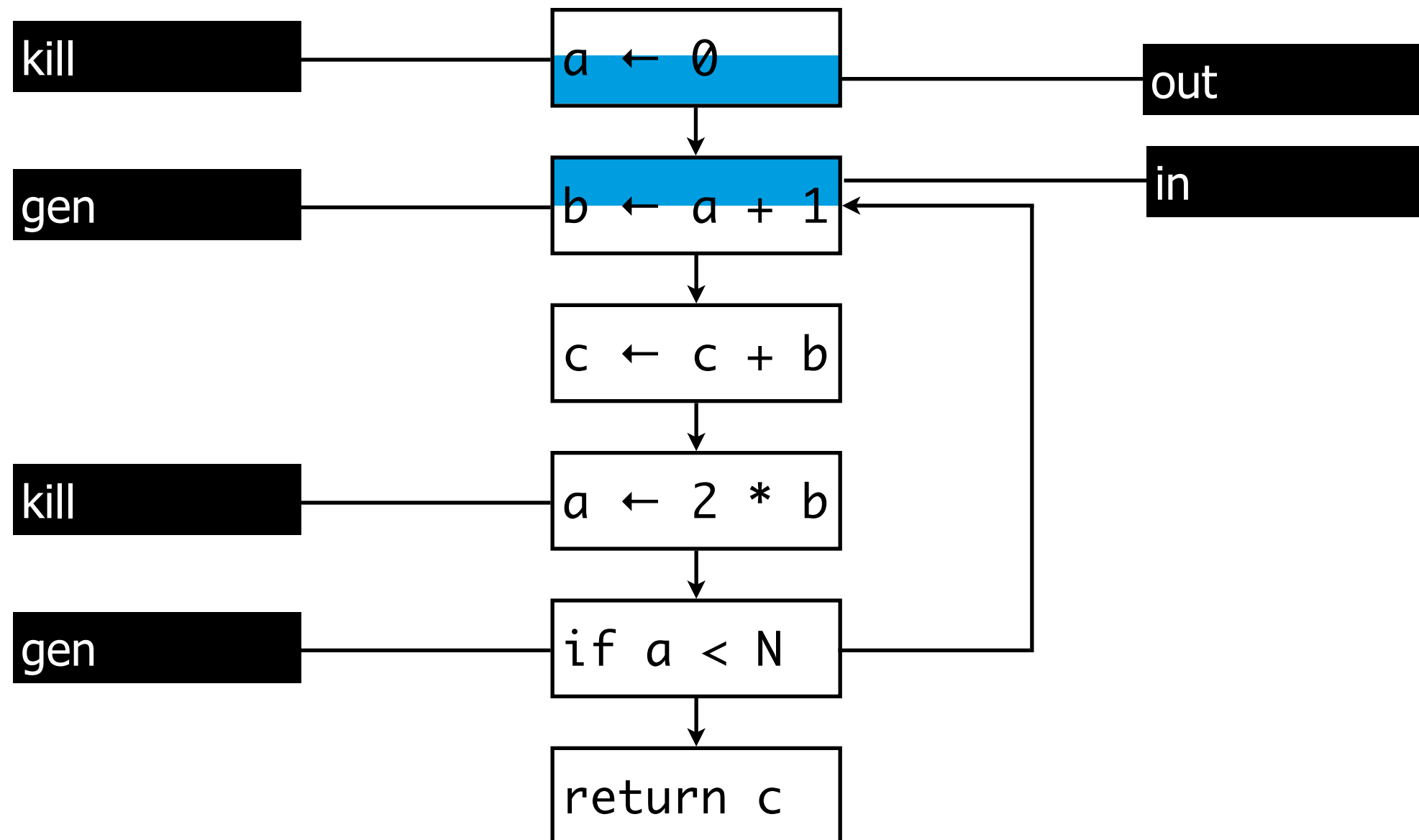
# Liveness analysis

## generalisation



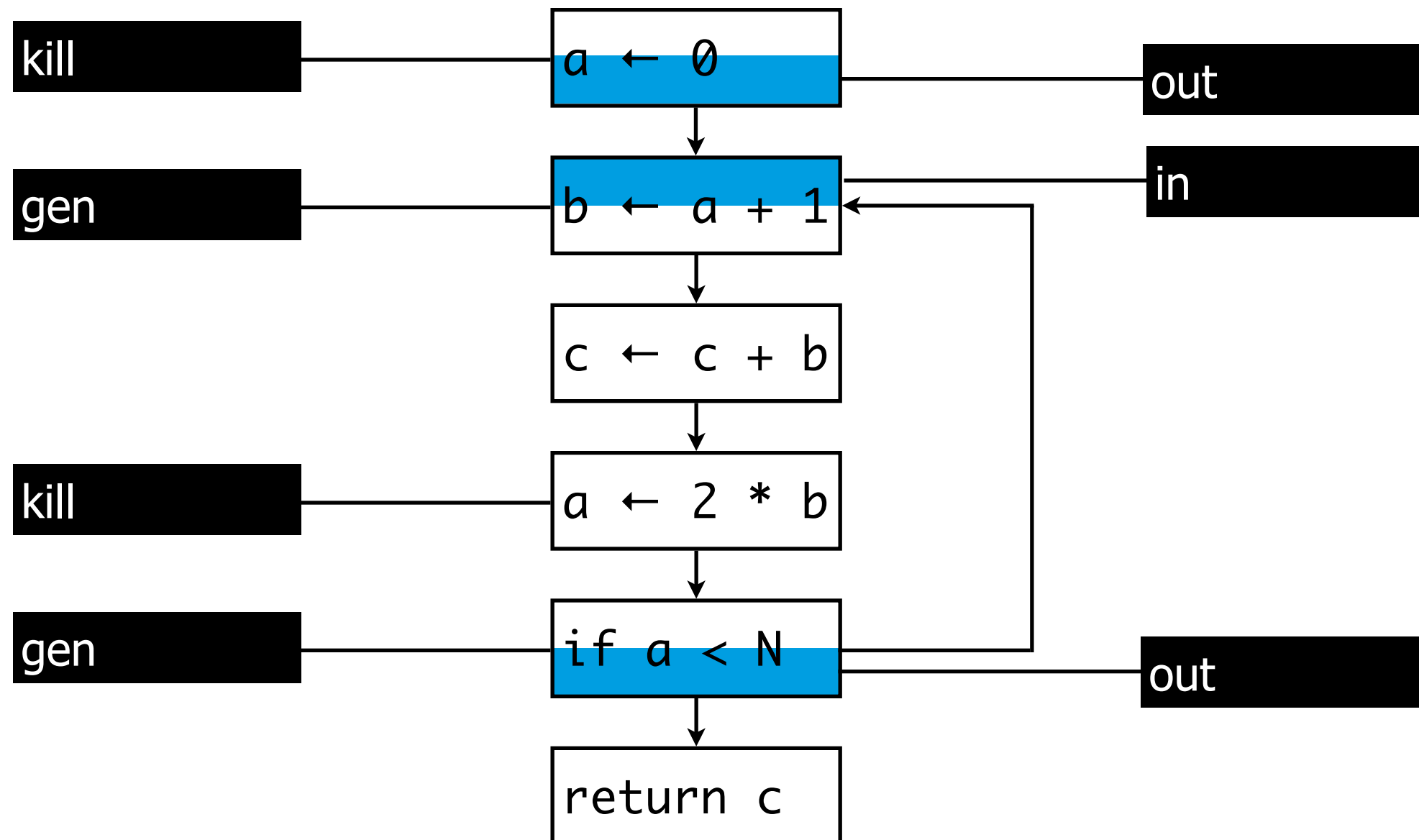
# Liveness analysis

## generalisation



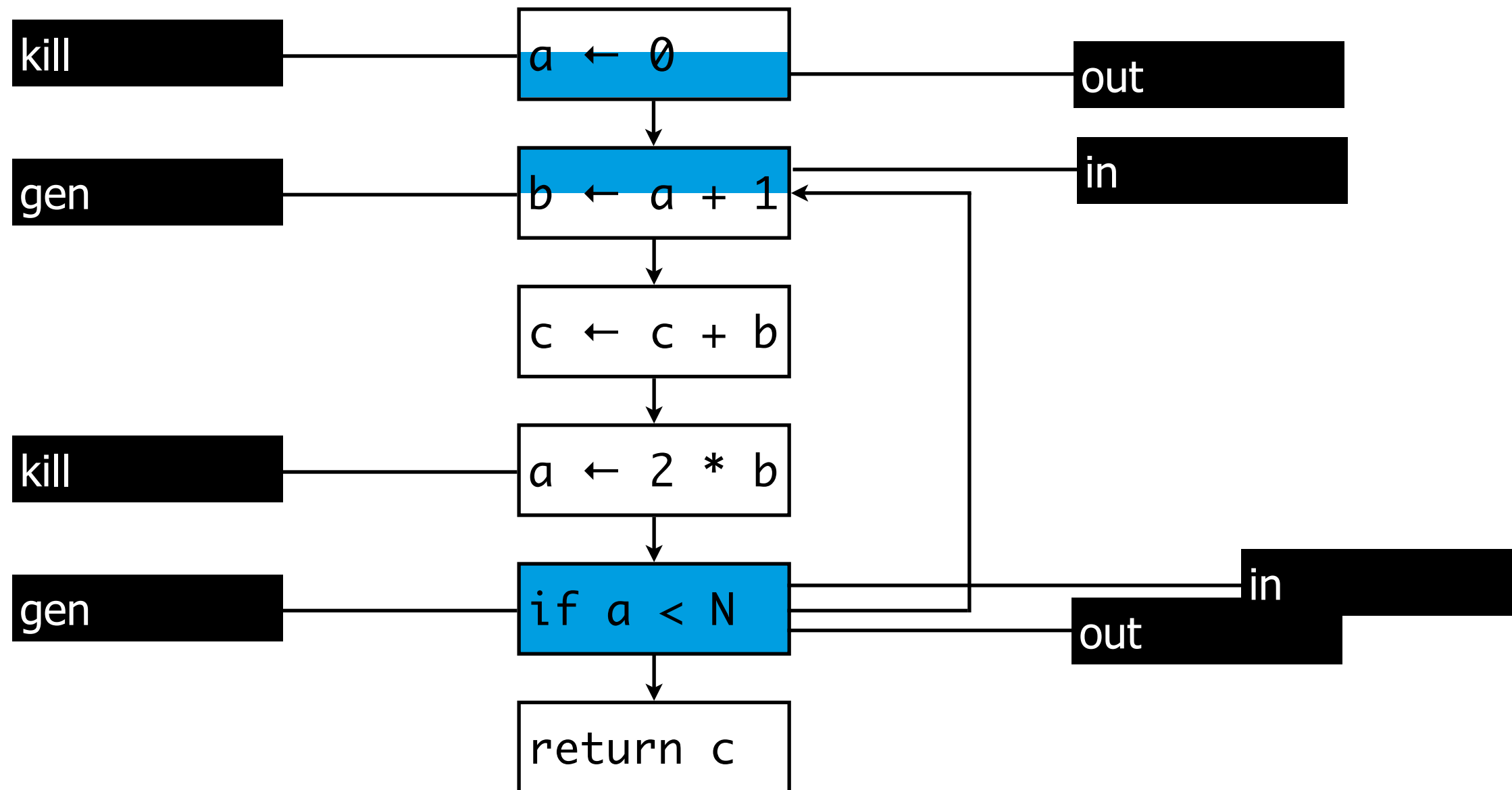
# Liveness analysis

## generalisation



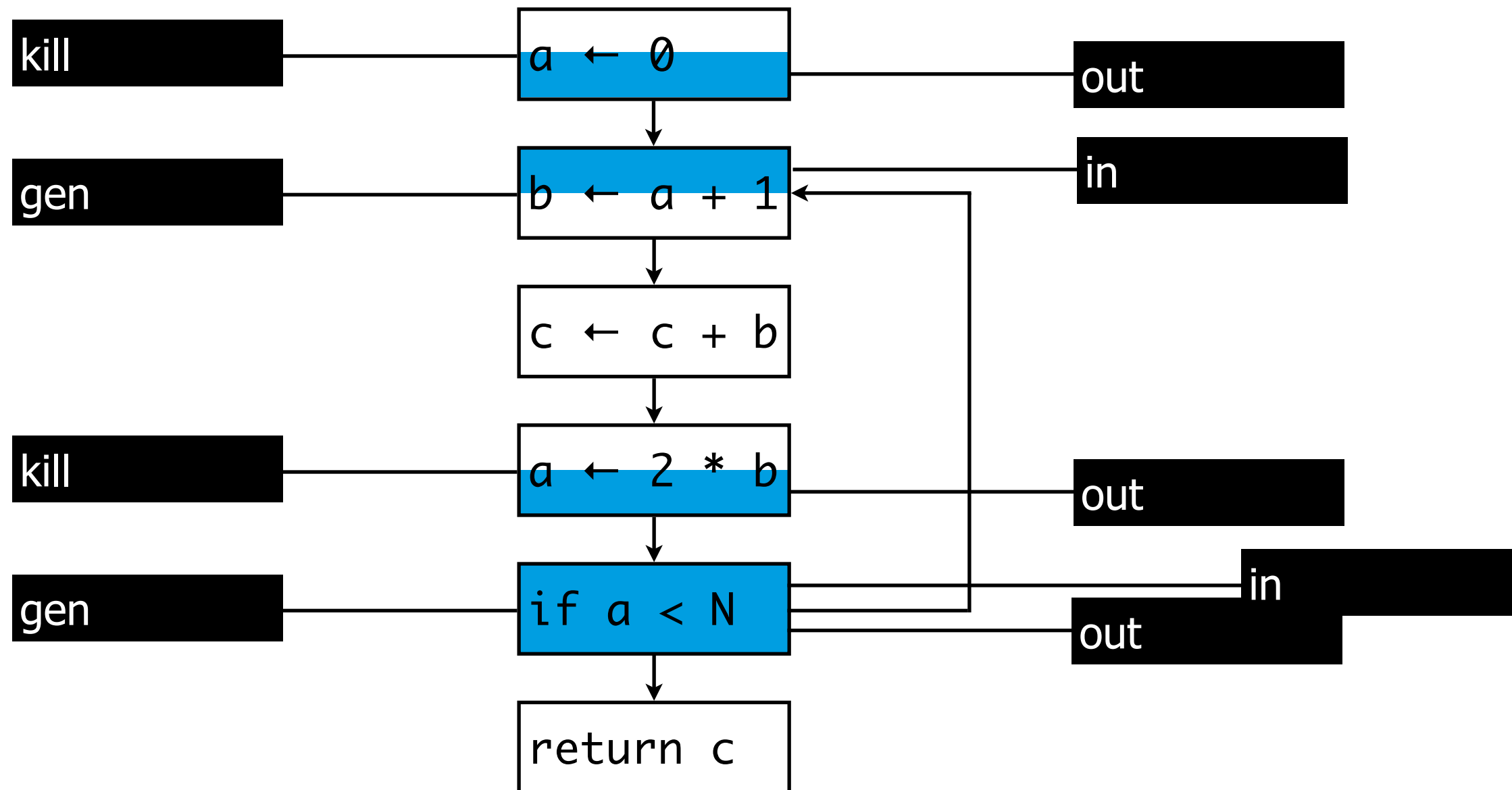
# Liveness analysis

## generalisation



# Liveness analysis

## generalisation



# Liveness analysis

## gen & kill

	gen	
$a \leftarrow b \oplus c$	$\{b, c\}$	
$a \leftarrow b$	$\{b\}$	
$a \leftarrow M[b]$	$\{b\}$	
$M[a] \leftarrow b$	$\{a, b\}$	
$f(a_1, \dots, a_n)$	$\{a_1, \dots, a_n\}$	
$a \leftarrow f(a_1, \dots, a_n)$	$\{a_1, \dots, a_n\}$	
goto L		
if $a \otimes b$	$\{a, b\}$	



# Liveness analysis

## gen & kill

	gen	kill
$a \leftarrow b \oplus c$	$\{b, c\}$	$\{a\}$
$a \leftarrow b$	$\{b\}$	$\{a\}$
$a \leftarrow M[b]$	$\{b\}$	$\{a\}$
$M[a] \leftarrow b$	$\{a, b\}$	
$f(a_1, \dots, a_n)$	$\{a_1, \dots, a_n\}$	
$a \leftarrow f(a_1, \dots, a_n)$	$\{a_1, \dots, a_n\}$	$\{a\}$
goto L		
if $a \otimes b$	$\{a, b\}$	

# Liveness analysis

## generalisation

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

$$\text{out}[n] = \bigcup_{s \in \text{succ}[n]} \text{in}[s]$$

coffee break



# III

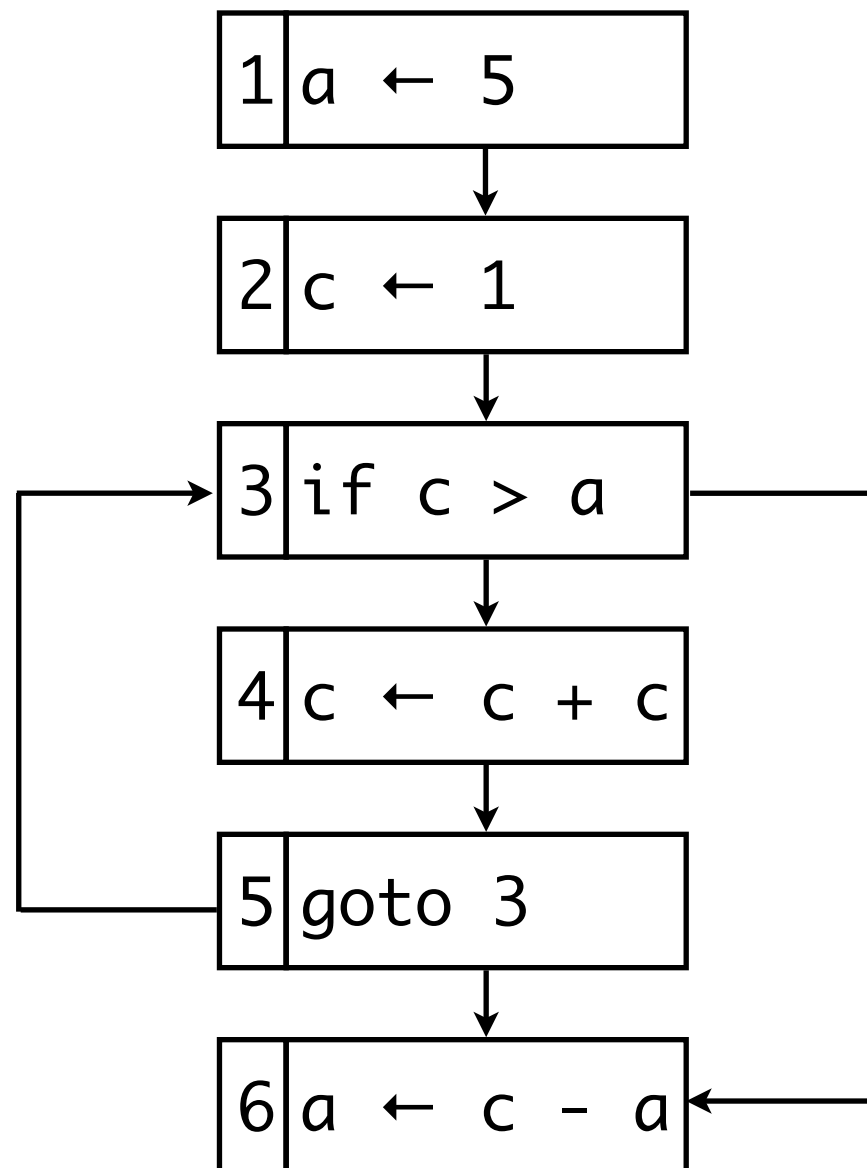
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more analyses

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# More analyses

## reaching definitions



# Reaching definitions

## gen & kill

	gen	
$d: a \leftarrow b \oplus c$	$\{d\}$	
$d: a \leftarrow b$	$\{d\}$	
$d: a \leftarrow M[b]$	$\{d\}$	
$M[a] \leftarrow b$		
$f(a_1, \dots, a_n)$		
$d: a \leftarrow f(a_1, \dots, a_n)$	$\{d\}$	
goto L		
if $a \otimes b$		

# Reaching definitions

## gen & kill

	gen	kill
$d: a \leftarrow b \oplus c$	$\{d\}$	$\text{defs}(a) - \{d\}$
$d: a \leftarrow b$	$\{d\}$	$\text{defs}(a) - \{d\}$
$d: a \leftarrow M[b]$	$\{d\}$	$\text{defs}(a) - \{d\}$
$M[a] \leftarrow b$		
$f(a_1, \dots, a_n)$		
$d: a \leftarrow f(a_1, \dots, a_n)$	$\{d\}$	$\text{defs}(a) - \{d\}$
goto L		
if $a \otimes b$		

# Reaching definitions

## formalisation

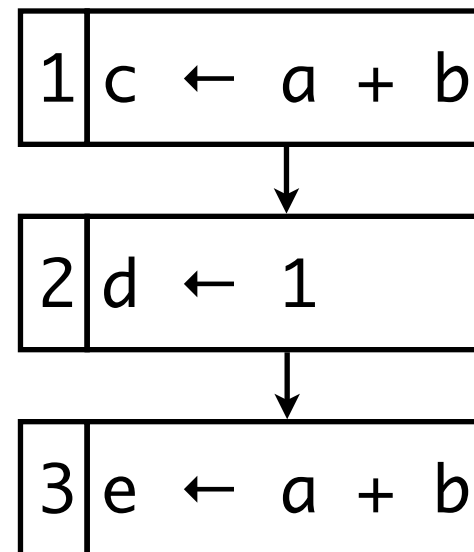
$$\text{in}[n] = \bigcup_{p \in \text{pred}[n]} \text{out}[p]$$

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



# More analyses

## available expressions



# Available expressions

## gen & kill

	gen	
$d: a \leftarrow b \oplus c$	$\{b \oplus c\} - \text{kill}$	
$d: a \leftarrow b$		
$d: a \leftarrow M[b]$	$\{M[b]\} - \text{kill}$	
$M[a] \leftarrow b$		
$f(a_1, \dots, a_n)$		
$d: a \leftarrow f(a_1, \dots, a_n)$		
goto L		
if $a \otimes b$		

# Available expressions

## gen & kill

	gen	kill
$d: a \leftarrow b \oplus c$	$\{b \oplus c\}$ -kill	$\text{exps}(a)$
$d: a \leftarrow b$		
$d: a \leftarrow M[b]$	$\{M[b]\}$ -kill	$\text{exps}(a)$
$M[a] \leftarrow b$		$\text{exps}(M[_])$
$f(a_1, \dots, a_n)$		$\text{exps}(M[_])$
$d: a \leftarrow f(a_1, \dots, a_n)$		$\text{exps}(M[_]) \cup \text{exps}(a)$
goto L		
if $a \otimes b$		

# Available expressions

## formalisation

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

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

# IV

---

optimisations

---

# Dead code elimination

## example

```
a ← 0  
b ← a + 1  
c ← c + b  
a ← 2 * b  
return c
```

```
a ← 0  
b ← a + 1  
c ← c + b  
return c
```

# Constant propagation

## example

```
a ← 0
b ← a + 1
c ← c + b
a ← 2 * b
return c
```

```
a ← 0
b ← 0 + 1
c ← c + b
a ← 2 * b
return c
```

# Copy propagation

## example

```
a ← e
b ← a + 1
c ← c + b
a ← 2 * b
return c
```

```
a ← e
b ← e + 1
c ← c + b
a ← 2 * b
return c
```



# Common subexpression elimination

## example

$c \leftarrow a + b$

$d \leftarrow 1$

$e \leftarrow a + b$

$x \leftarrow a + b$

$c \leftarrow x$

$d \leftarrow 1$

$e \leftarrow x$

# V

---

## summary

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# Summary

## lessons learned

### liveness analysis

- intermediate language
- control-flow graphs
- definition & algorithm

### more dataflow analyses

- reaching definitions
- available expressions

### optimisations

# Literature

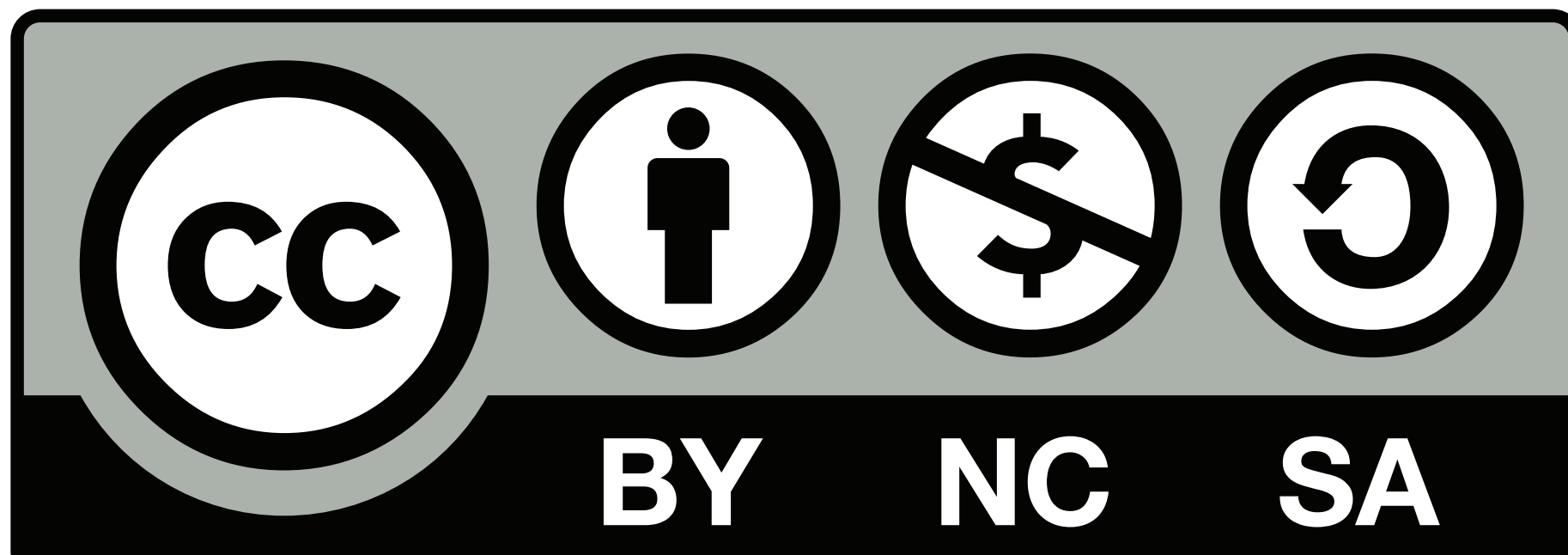
[learn more](#)

Andrew W. Appel, Jens Palsberg: Modern Compiler Implementation in Java, 2nd edition. 2002

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