



**LUND**  
UNIVERSITY

# EDAP15: Program Analysis

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**DATAFLOW ANALYSIS 3**  
**INTERPROCEDURAL ANALYSIS**

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# Inter- vs. Intra-Procedural Analysis

- ▶ **Intra**procedural: Within one procedure
- ▶ **Inter**procedural: Across multiple procedures

# Limitations of Intra-Procedural Analysis

## Teal-0

```
a := 7;  
d := f(a, 2);  
e := a + d;
```

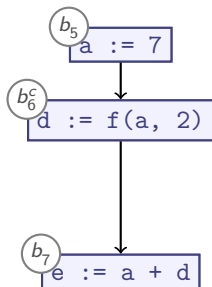
## Teal-0

```
fun f(x, y) = {  
  z := 0;  
  if x > y {  
    z := x;  
  } else {  
    z := y;  
  }  
  return z;  
}
```

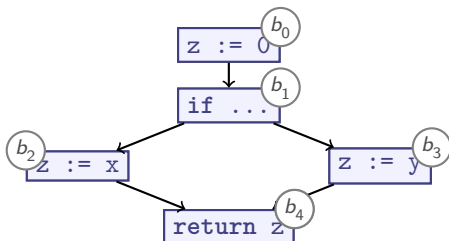
How can we compute ~~Reachable~~ Definitions here?

*backing*

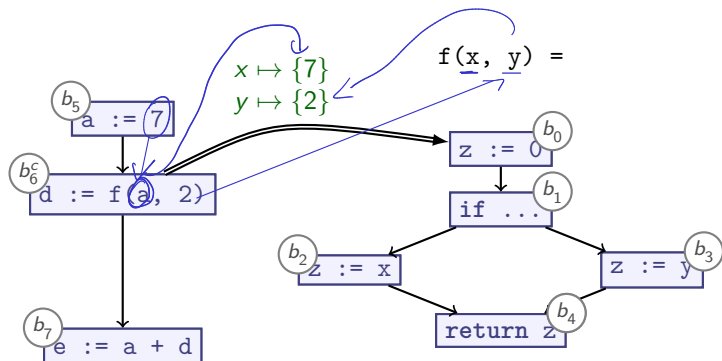
# A Naïve Inter-Procedural Analysis



$f(x, y) =$

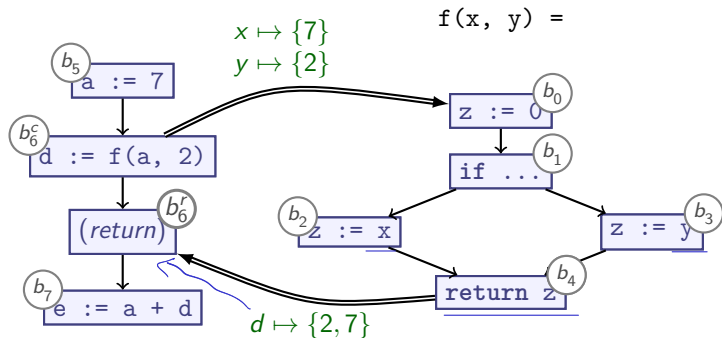


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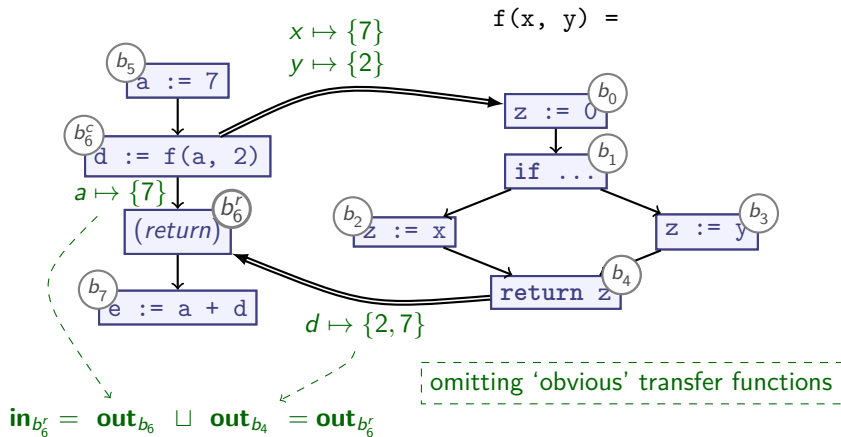
omitting 'obvious' transfer functions

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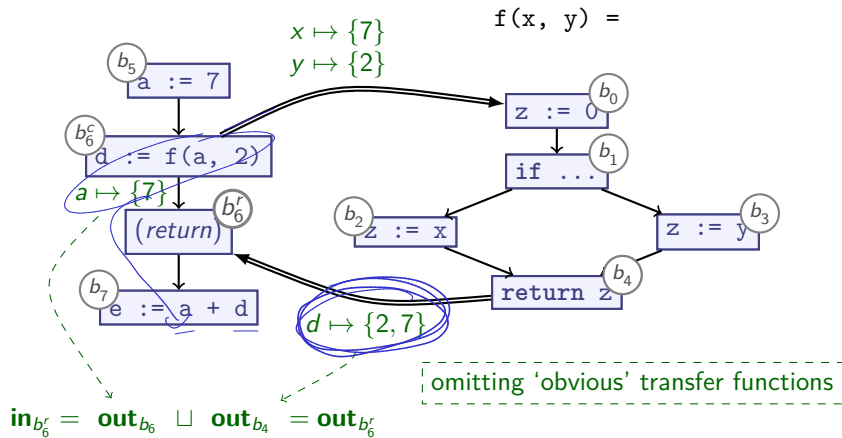


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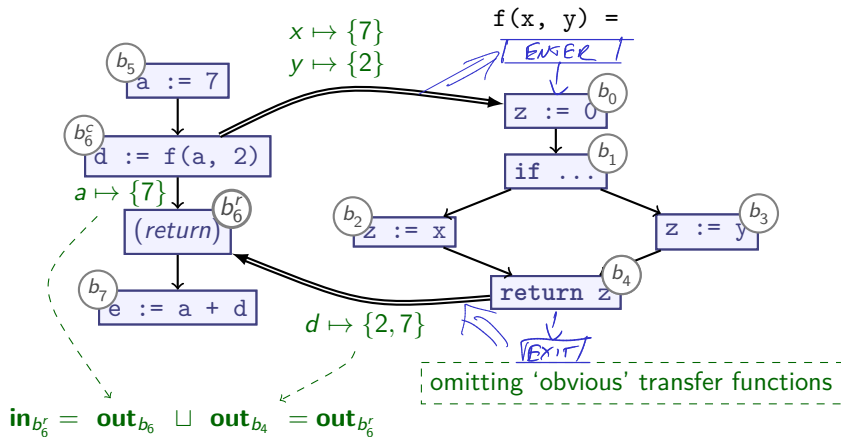
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►  $\text{out}_{b_7}: e \mapsto \{9, 14\}$



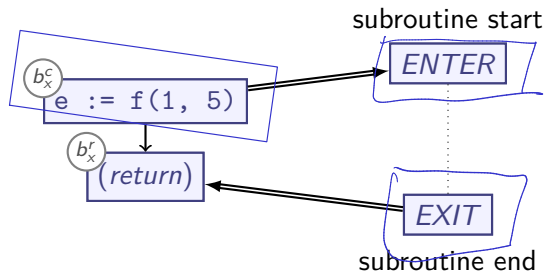
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► **out<sub>b<sub>7</sub></sub>:**  $e \mapsto \{9, 14\}$

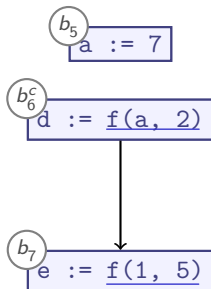
**Works rather straightforwardly!**

# Inter-Procedural Data Flow Analysis

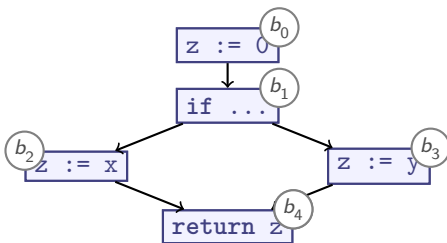


- ▶ Split call sites  $b_x$  into *call* ( $b_x^c$ ) and *return* ( $b_x^r$ ) nodes
- ▶ Intra-procedural edge  $b_x^c \longrightarrow b_x^r$  carries environment/store
- ▶ Inter-procedural edge ( $\Rightarrow$ ):
  - ▶ Caller  $\Rightarrow$  subroutine, substitutes parameters (for pass-by-value)
  - ▶ Caller  $\Leftarrow$  return, substitutes result (for pass-by-result)
  - ▶ Otherwise as intra-procedural data flow edge

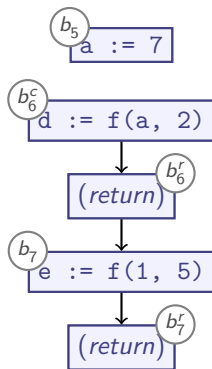
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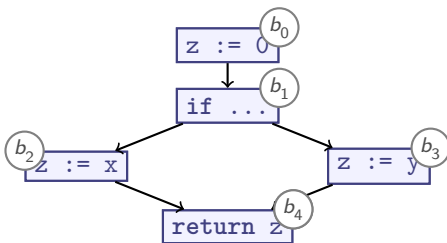
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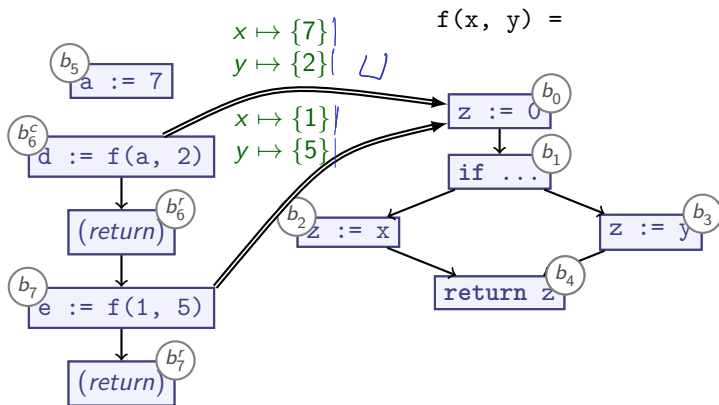
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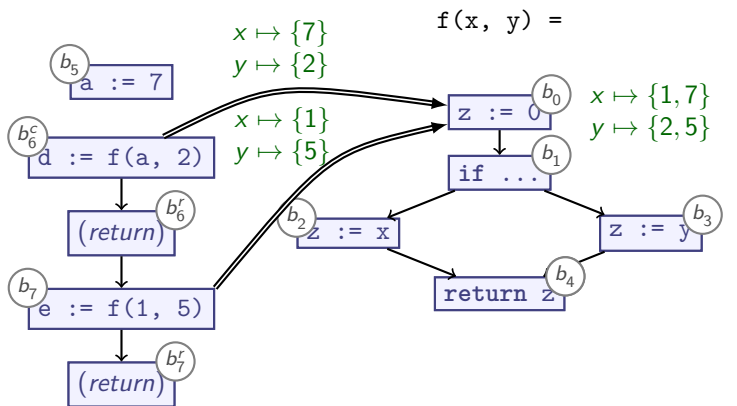
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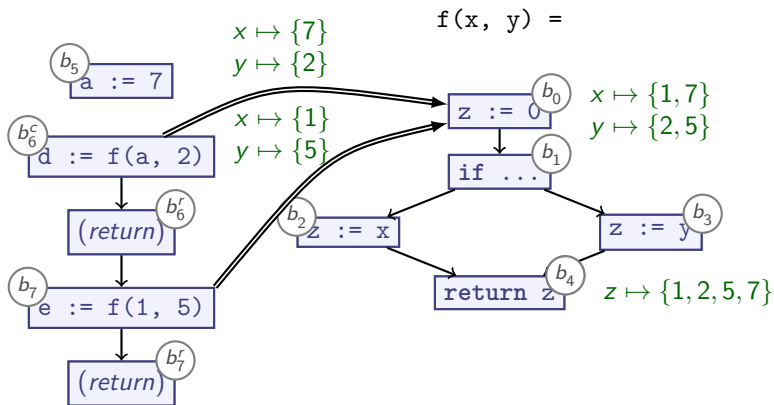
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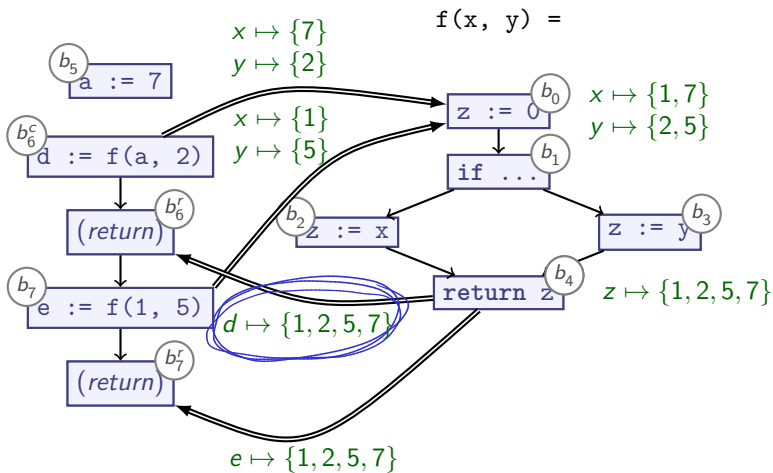
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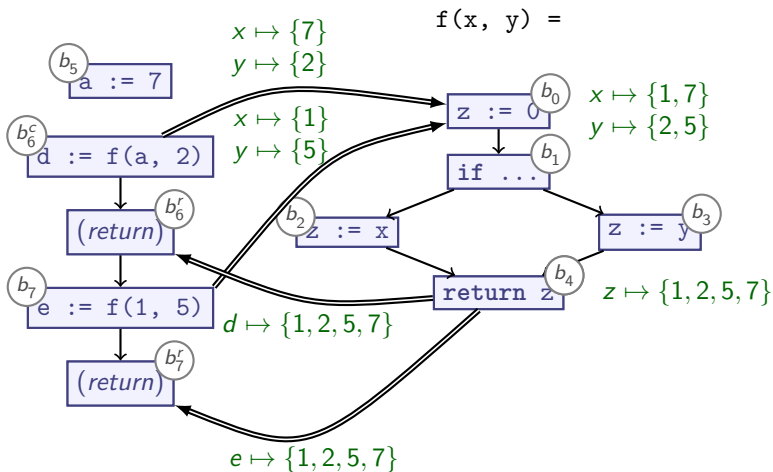


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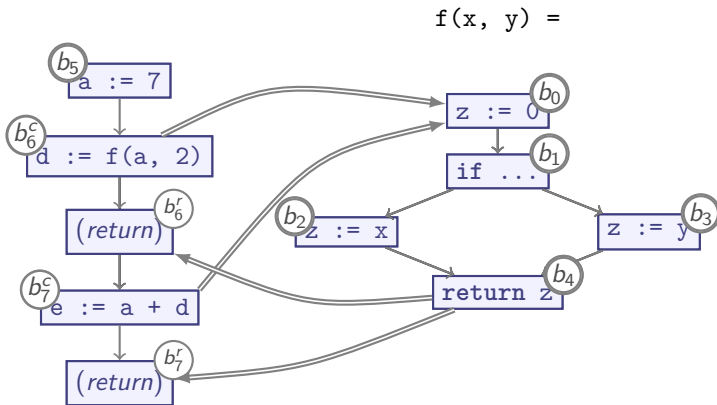


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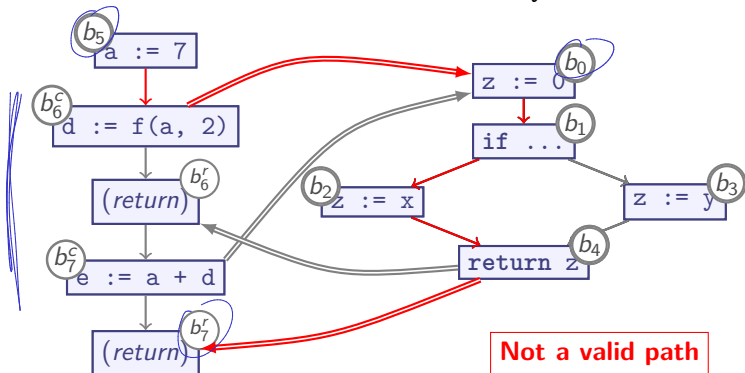
**Imprecision!**

# Context Sensitivity: Valid Paths

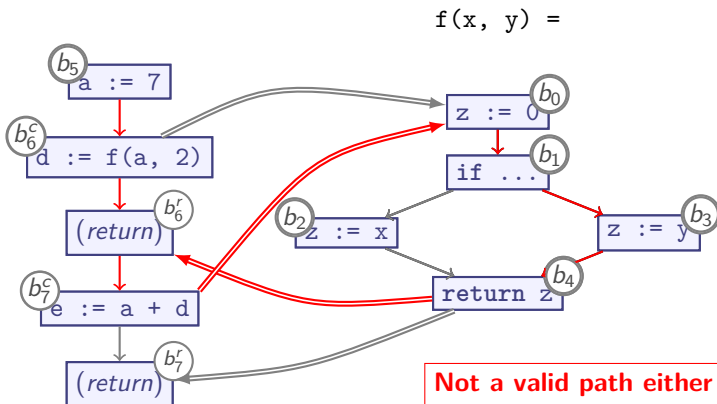


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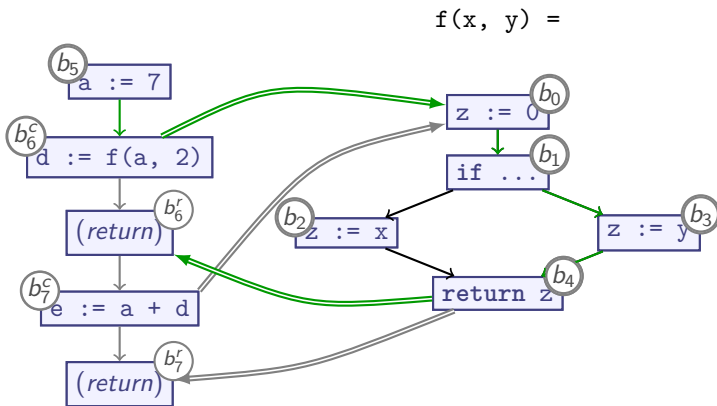
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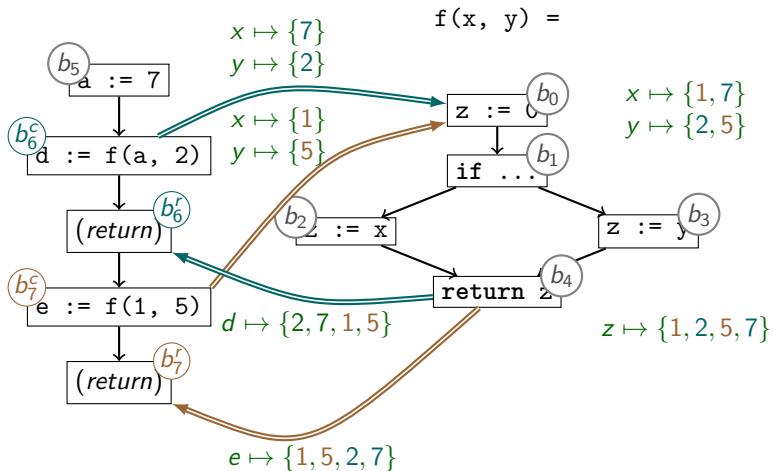
►  $[b_5, b_6^c, b_0, b_1, b_3, b_4, b_6^r]$

Context-sensitive interprocedural analyses consider only valid paths

# Summary

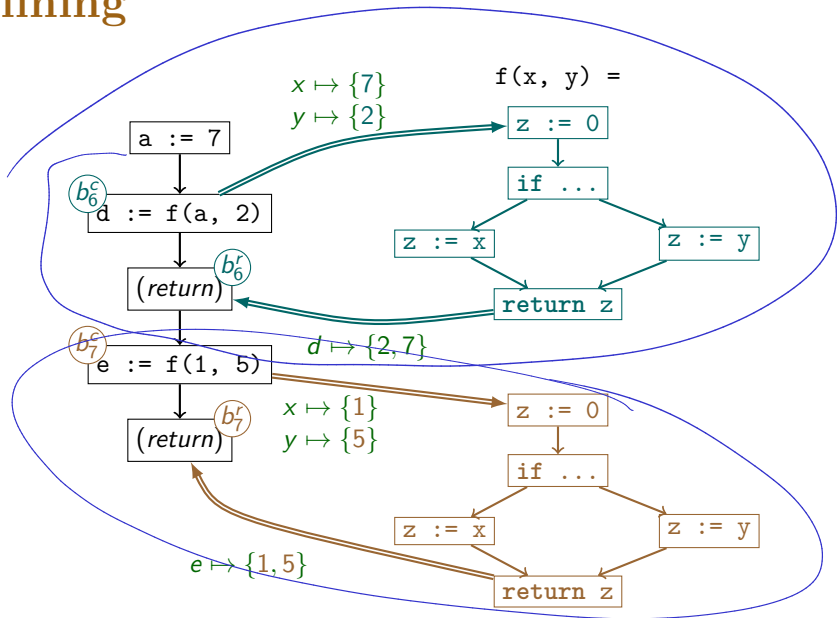
- ▶ **Intraprocedural** Data Flow Analysis is highly imprecise with subroutine calls
- ▶ **Interprocedural** Data Flow Analysis is more precise:
  - ▶ Split call site into call site + return site
  - ▶ Add flow edges between call sites, subroutine entry
  - ▶ Add flow edges between subroutine return, return site
  - ▶ Carry environment from call site to return site
- ▶ Interprocedural analysis must typically consider the entire program
  - ⇒ **whole-program analysis**
- ▶ Naïve interprocedural analysis is **context-insensitive**
  - ▶ Merge all callers into one

# Interprocedural Data Flow Analysis



**Context-insensitive:** analysis merges all callers to  $f()$

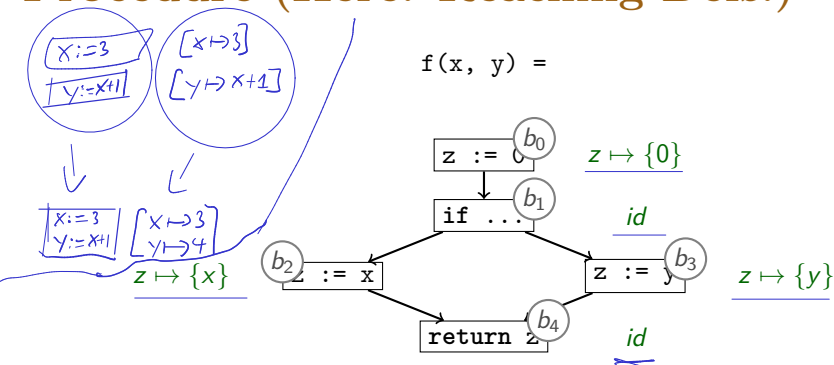
# Inlining



Clone subroutine IRs for each *calling context*



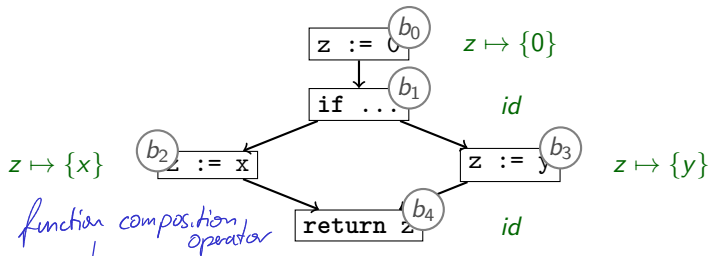
# Alternative to Inlining: Summarise Procedure (Here: Reaching Defs.)



- Compose transfer functions:

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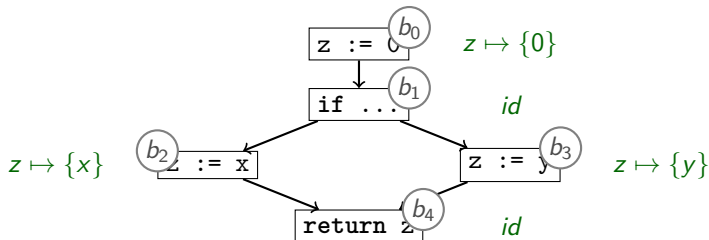


- Compose transfer functions:

- $\underline{trans_{b_0}} \odot \underline{trans_{b_1}} = [z \mapsto 0]$

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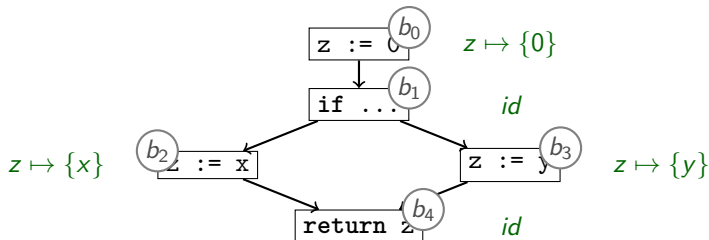


► *Compose transfer functions:*

- $trans_{b_0} \circ trans_{b_1} = [z \mapsto 0]$
- $trans_{b_0} \circ trans_{b_1} \circ trans_{b_2} = [z \mapsto \{x\}]$

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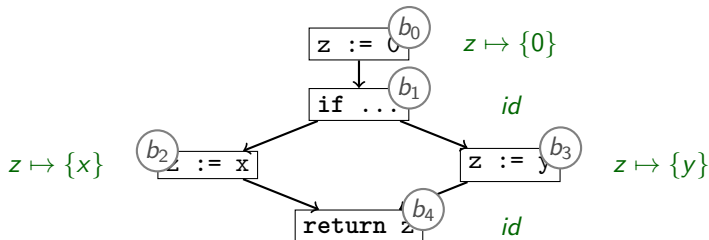


► **Compose transfer functions:**

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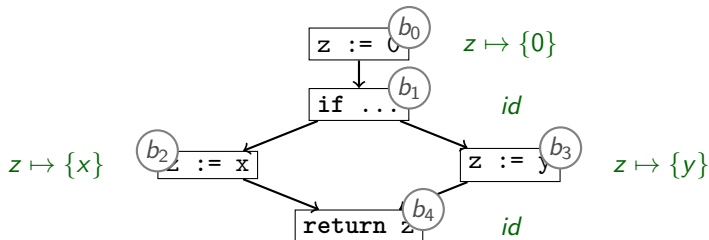


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- $trans_{b_0} \circ trans_{b_1} \circ (trans_{b_2} \vee trans_{b_3}) = [z \mapsto \{x, y\}]$

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## ► Compose transfer functions:

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- $trans_{b_0} \circ trans_{b_1} \circ (trans_{b_2} \parallel trans_{b_3}) = [z \mapsto \{x, y\}]$
- $trans_{b_0} \circ trans_{b_1} \circ (trans_{b_2} \parallel trans_{b_3}) \circ trans_{b_4} = [z \mapsto \{x, y\}]$

# Procedure Summaries vs Recursion

`f calls g calls h calls f`

- ▶ Requires additional analysis to identify who calls whom
- ▶ Compute summaries of mutually recursive functions together
- ▶ Recursive call edges analogous to loops

# Procedure Summaries

- ▶ Composing transfer functions yields a combined transfer function for  $f()$ :

$$trans_f = [\mathbf{return} \mapsto \{x, y\}]$$

- ▶ Use  $trans_f$  as transfer function for  $f()$ , discard  $f$ 's body



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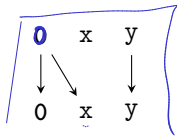
- ▶ **Limitations:**

- ▶ Requires suitable representation for summary
- ▶ Requires mechanism for abstracting and applying summary
- ▶ Worst cases:
  - ▶  $trans_f$  is symbolic expression as complex as  $f$  itself

# Representation Relations

Example procedure summary representation:

```
x := null;  
y := y;
```



```
if x != y {  
    x := y;  
}  
y := 1;
```

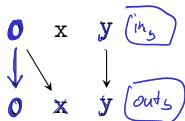
**'May be null' analysis**

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▶  $c \rightarrow d$ :  
if  $P(c) \in \text{in}_b$  then  $P(d) \in \text{out}_b$

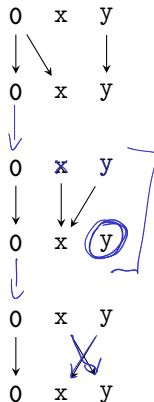
# Representation Relations

Example procedure summary representation:

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x := null;
y := y;
```

```
if (x != y) {
  x := y;
}
y := 1;
```

```
{ t := x
  x := y
  y := t }
```



**'May be null' analysis**

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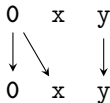
# Summary

- ▶ **Context-sensitive** analysis distinguishes ‘calling context’ when analysing subroutine
  - ▶ ‘Who called me’?
  - ▶ Can go deeper: ‘And who called them?’
- ▶ **Inlining** is one strategy for **context-sensitive** analysis
- ▶ Copy subroutine bodies for each caller
- ▶ Alternative: **Procedure summaries** built from composed transfer functions
- ▶ Can speed up context-sensitive analysis of popular functions, compared to inlining
- ▶ Needs some suitably abstract analysis *for the given program*
  - ▶ Example: IFDS-style **Representation Relations**
- ▶ Recursion is nontrivial:
  - ▶ Analyse function calls (*call graph*)
  - ▶ Analyse strongly connected components together

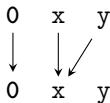
# Composing Representation Relations

Recall Representation Relations (*may be null* analysis):

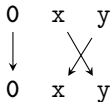
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```

0	x	y
↓	↘	↓
0	x	y

0	x	y
↓	↓	↙
0	x	y

0	x	y
↓	↘	↙
0	x	y

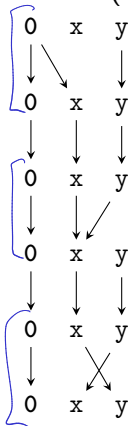
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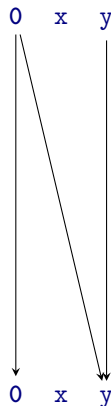
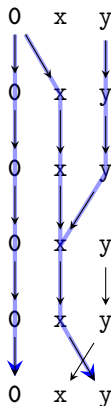
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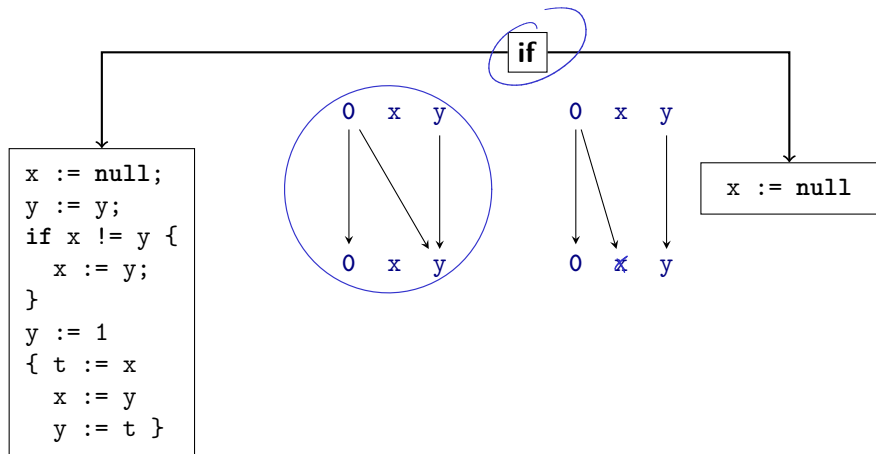
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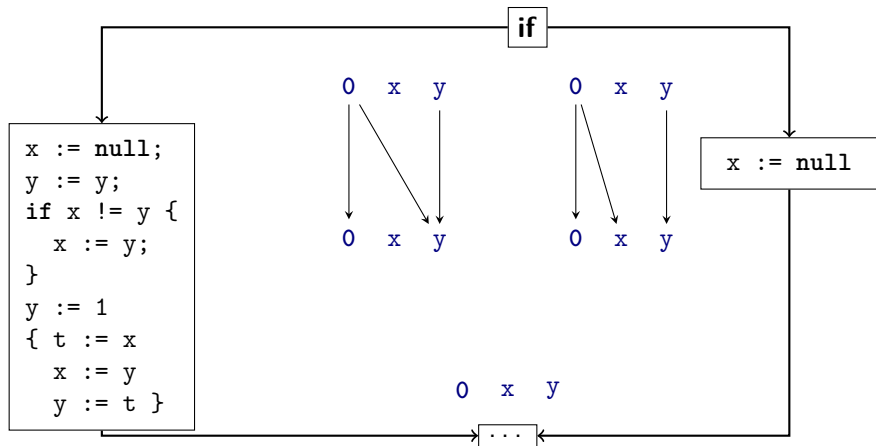


**Composed representation relations are again representation relations**

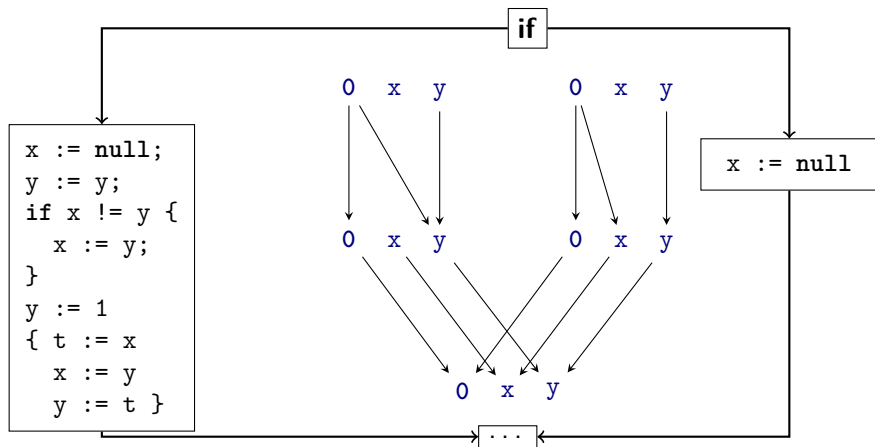
# Merging Control-Flow Paths



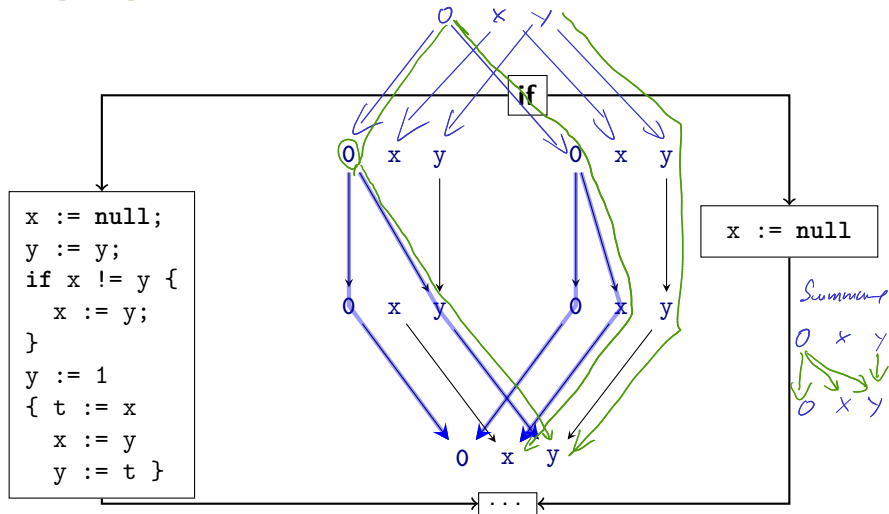
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Logical "Or"



# Dataflow via Graph Reachability

$$n = \langle b, v \rangle$$

- ▶ Assume binary lattice  $(\{\top, \perp\}, \sqsubseteq, \sqcap, \sqcup)$ 
  - ▶  $a \sqcup b = \top$  iff  $a = \perp$  and  $b = \perp$ , otherwise  $a \sqcup b = \top$
  - ▶ Equivalently for 'Must' analysis:  
'must be null' = not ('may be non-null')
- ▶ We can encode Dataflow problem as *Graph-Reachability*
- ▶ Graph nodes  $n = \langle b, v \rangle$ 
  - ▶  $b$ : CFG node
  - ▶  $v$ : Variable or **0**
    - ▶ Variable: Property of interest connected to variable
    - ▶ **0**: Property of interest connected to executing this statement/block

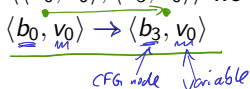
# A Dataflow Worklist Algorithm: IFDS

- ▶ Context-sensitive interprocedural dataflow algorithm
- ▶ Historical name: IFDS  
(Interprocedural **F**inite **D**istributive **S**ubset problems)
- ▶ 'Exploded Supergraph':  $G^\# = (N^\#, E^\#)$ 
  - ▶  $N^\# = N_{CFG} \times \mathcal{V} \cup \{0\}$
  - ▶ Plus parameter/return call edges
- ▶  $b_{main}^s$  is the CFG *ENTER* node of the main entry point
- ▶ Property-of-interest holds if reachable from  $\langle \underline{b_{main}^s}, \underline{0} \rangle$
- ▶ **Key ideas:**
  - ▶ Worklist-based
  - ▶ Construct Representation Relations on demand
    - ▶ Construct 'Exploded Supergraph'
      - ▶ CFG of all functions  $\times \mathcal{V} \cup \{0\}$

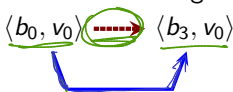


# IFDS Datastructures

Instead of  $\langle\langle b_0, v_0 \rangle, \langle b_3, v_0 \rangle\rangle$  we also write:



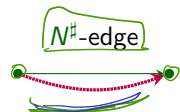
WORKLIST edge



PATHEDGE edge

All WORKLIST edges are also PATHEDGE edges

Result of our analysis



SUMMARYINST

Generated from summary nodes  
Otherwise equivalent to  $N^\#$ -edges

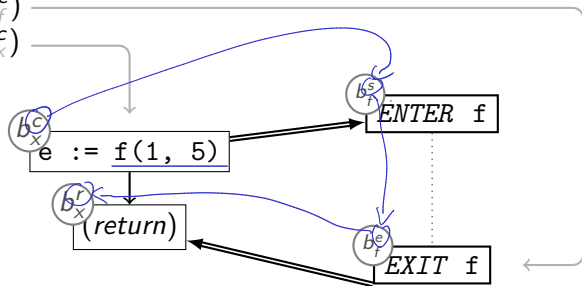
# IFDS Strategy

- ▶ Algorithm distinguishes between three types of nodes:

- ▶ Exit nodes ( $b_f^e$ )

- ▶ Call nodes ( $b_x^c$ )

- ▶ Other nodes



# On-demand processing

```
Procedure propagate( $n_1 \rightarrow n_2$ ):  
begin  
  if  $n_1 \rightarrow n_2 \in \text{PATHEDGE}$  then  
    return // finish quickly  
  PATHEDGE := PATHEDGE  $\cup \{n_1 \rightarrow n_2\}$   
  WORKLIST := WORKLIST  $\cup \{n_1 \rightarrow n_2\}$   
end
```

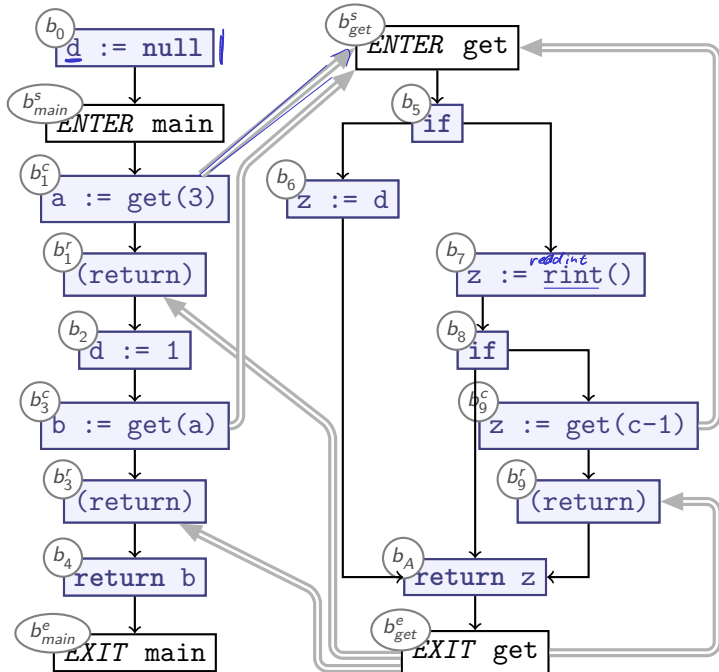
# Running Example

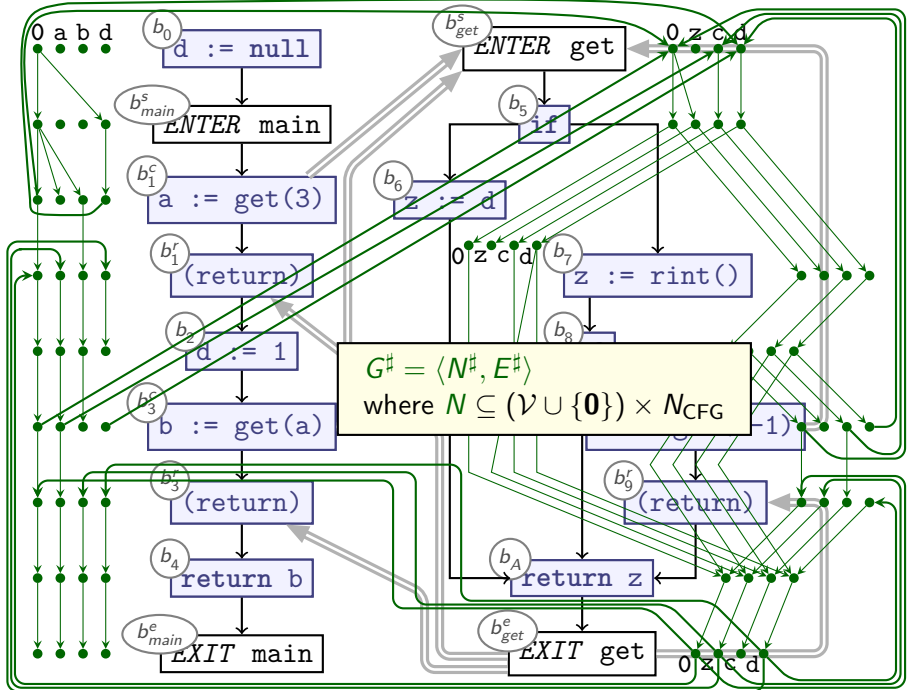
## Teal-0: *main()*

```
var default := null;  
fun main() = {  
  var a := get(3);  
  default := 1;  
  var b := get(3);  
  return b;  
}
```

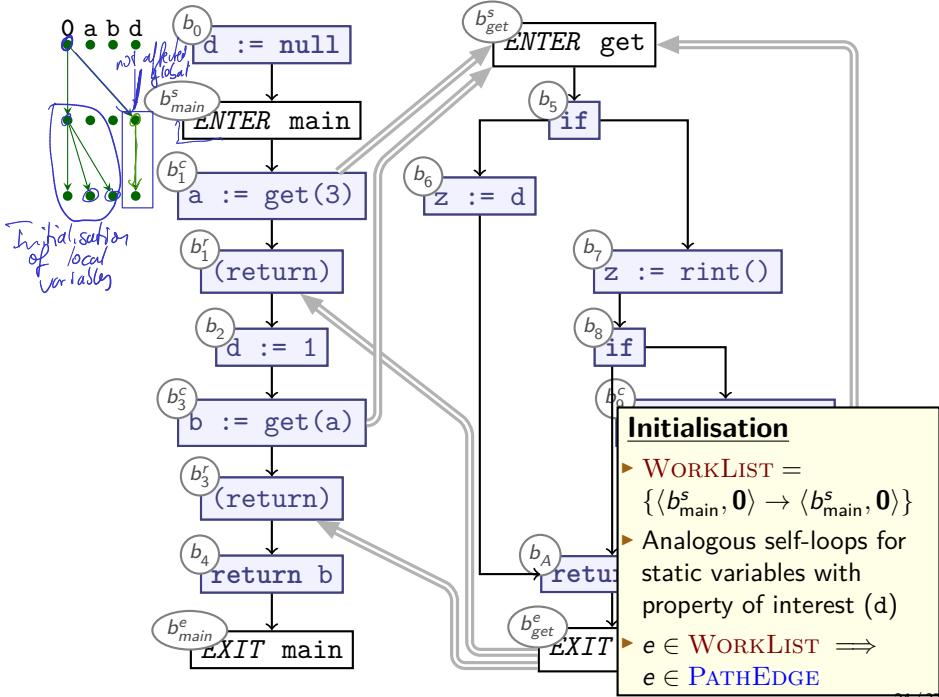
## Teal-0: *get()*

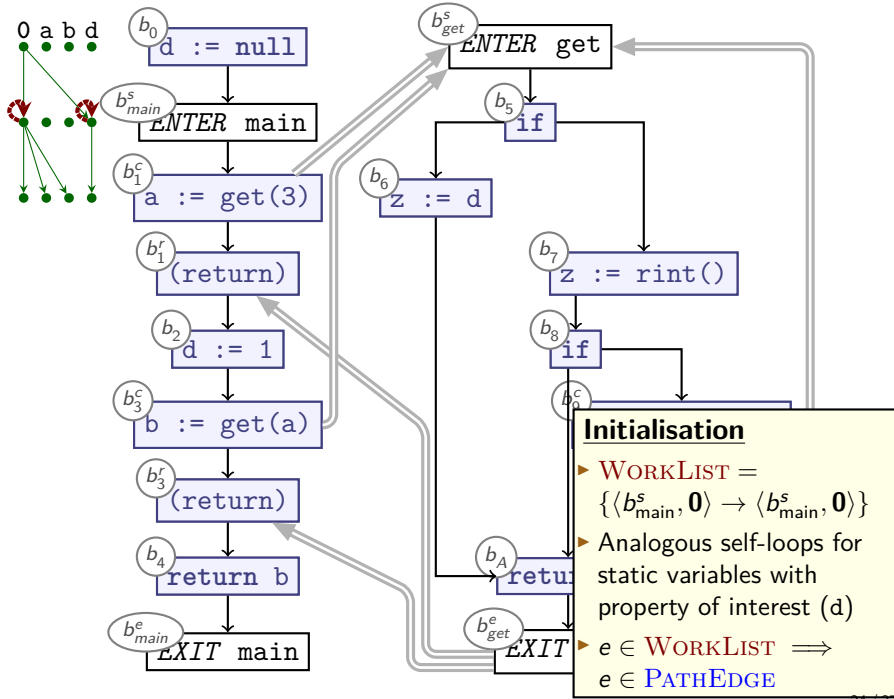
```
fun get(c) = {  
  if c == 0 {  
    z := default;  
  } else {  
    z := read_int();  
    if z < 0 {  
      z := get(c - 1);  
    }  
  }  
  return z;  
}
```

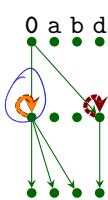


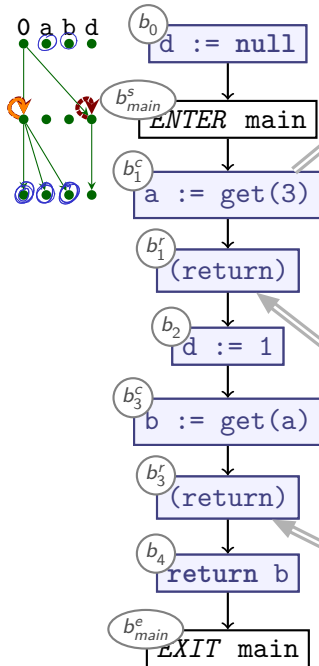












**Procedure** propagate( $n_1 \rightarrow n_2$ ):

**begin**

**if**  $n_1 \rightarrow n_2 \in \text{PATHEDGE}$  **then**

**return**

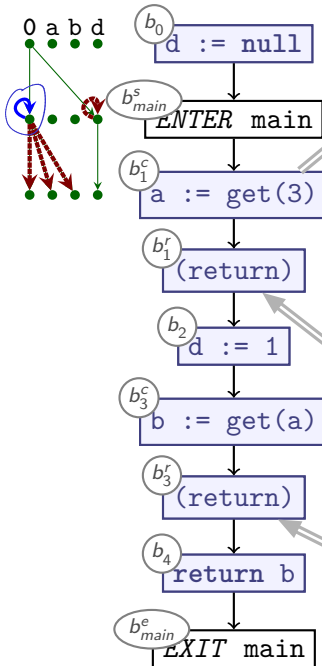
$\text{PATHEDGE} := \text{PATHEDGE} \cup \{n_1 \rightarrow n_2\}$

$\text{WORKLIST} := \text{WORKLIST} \cup \{n_1 \rightarrow n_2\}$

**end**

### Step (regular edge)

- Pick  $e$  off the work queue  
 $e = n_1 \rightarrow n_2$   
 $\langle 0, b_{main}^s \rangle \langle 0, b_{main}^s \rangle$
- $n_2$  neither call (c) nor exit (e)?
- Find all  $n_2 \rightarrow n_3$   
propagate( $n_1 \rightarrow n_3$ )
- Remove  $e$  from **WORKLIST**
- $e$  remains in **PATHEDGE**



**Procedure** propagate( $n_1 \rightarrow n_2$ ):

**begin**

**if**  $n_1 \rightarrow n_2 \in \text{PATHEDGE}$  **then**

**return**

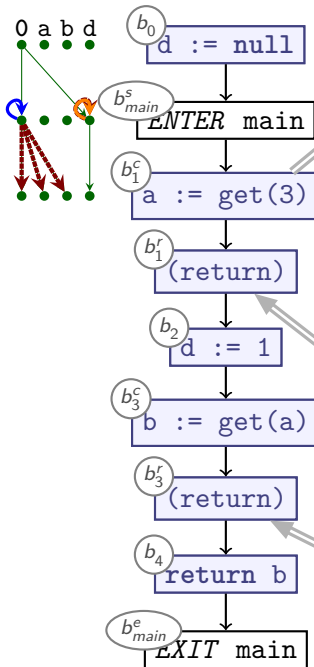
$\text{PATHEDGE} := \text{PATHEDGE} \cup \{n_1 \rightarrow n_2\}$

$\text{WORKLIST} := \text{WORKLIST} \cup \{n_1 \rightarrow n_2\}$

**end**

### **Step (regular edge)**

- ▶ Pick  $e$  off the work queue  
 $e = n_1 \rightarrow n_2$
- ▶  $n_2$  neither call (c) nor exit (e)?
- ▶ Find all  $n_2 \rightarrow n_3$   
propagate( $n_1 \rightarrow n_3$ )
- ▶ Remove  $e$  from **WORKLIST**
- ▶  $e$  remains in **PATHEDGE**



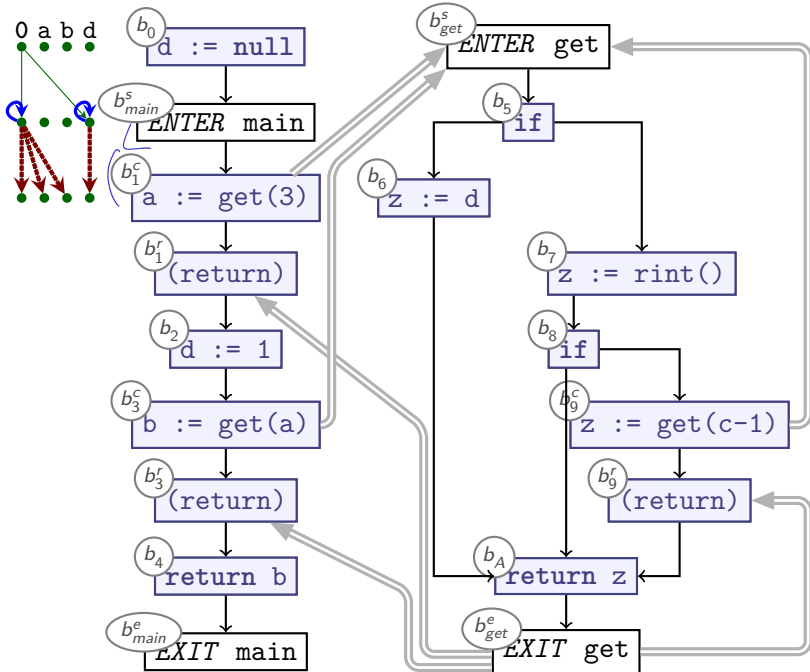
```

Procedure propagate( $n_1 \rightarrow n_2$ ):
begin
  if  $n_1 \rightarrow n_2 \in \text{PATHEDGE}$  then
    return
   $\text{PATHEDGE} := \text{PATHEDGE} \cup \{n_1 \rightarrow n_2\}$ 
   $\text{WORKLIST} := \text{WORKLIST} \cup \{n_1 \rightarrow n_2\}$ 
end

```

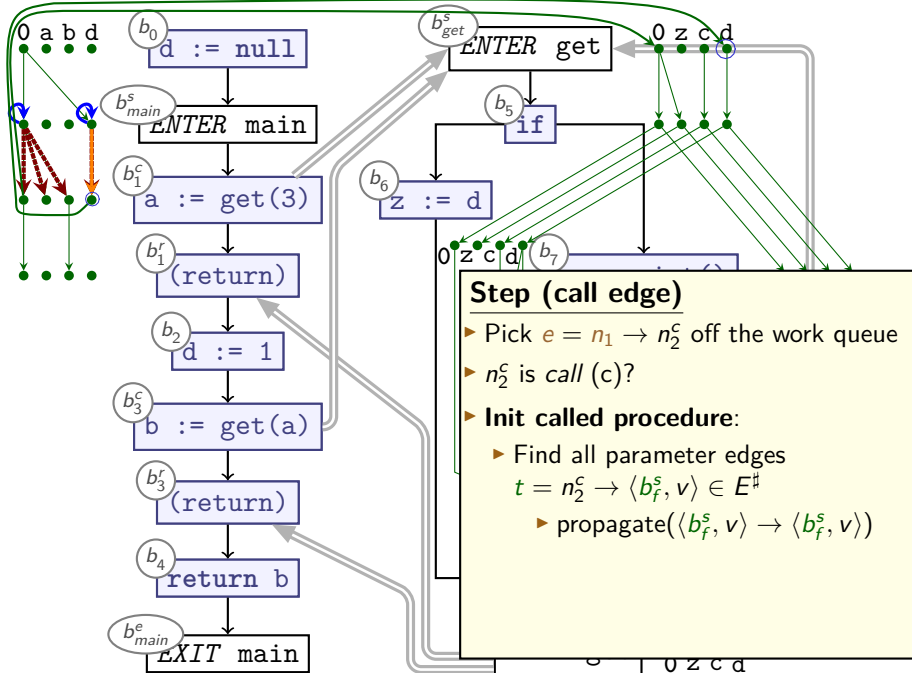
### Step (regular edge)

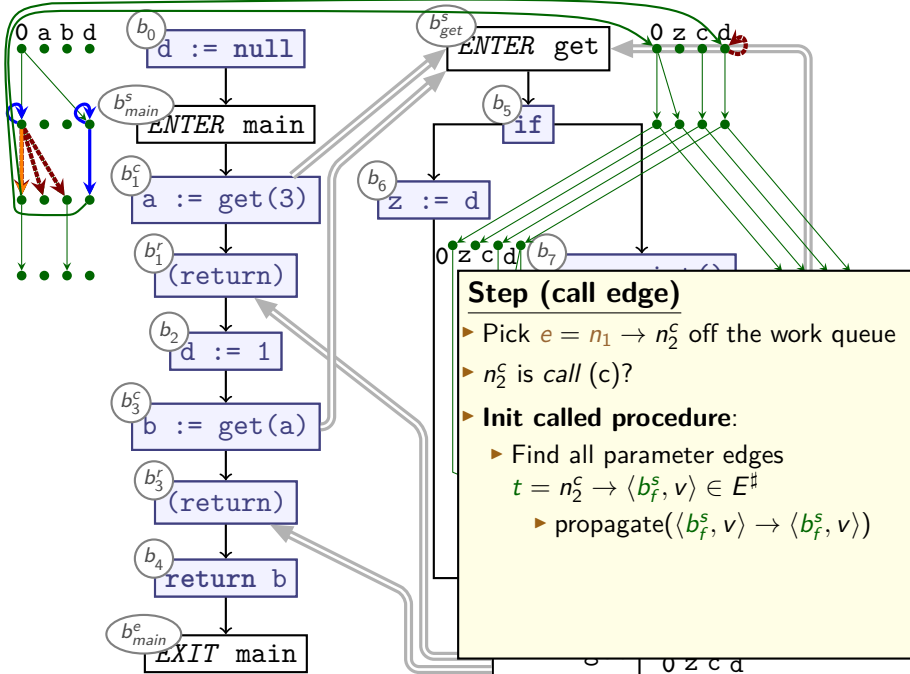
- ▶ Pick  $e$  off the work queue  
 $e = n_1 \rightarrow n_2$
- ▶  $n_2$  neither call (c) nor exit (e)?
- ▶ Find all  $n_2 \rightarrow n_3$   
propagate( $n_1 \rightarrow n_3$ )
- ▶ Remove  $e$  from  $\text{WORKLIST}$
- ▶  $e$  remains in  $\text{PATHEDGE}$

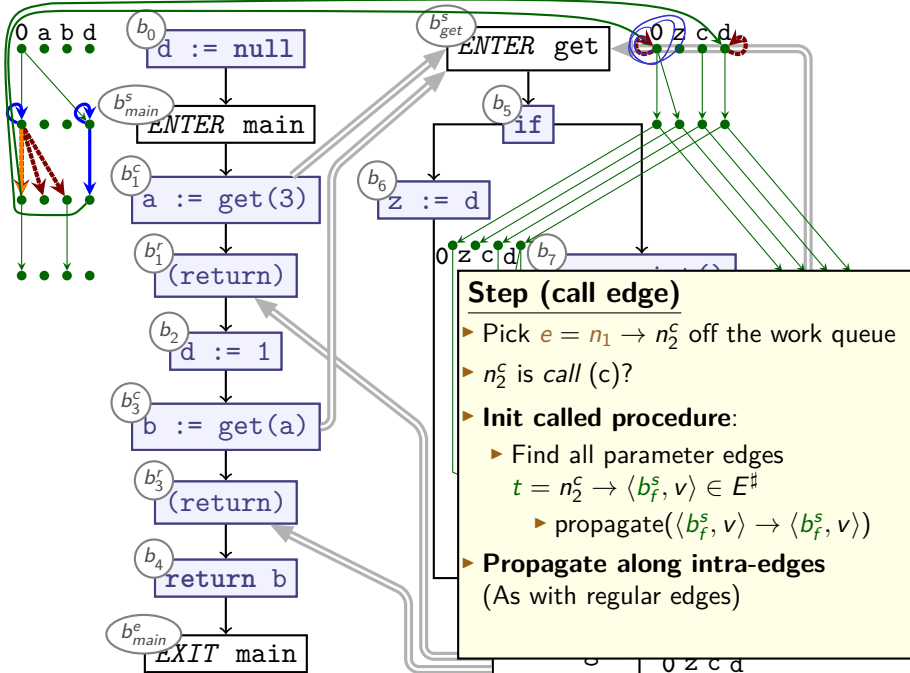


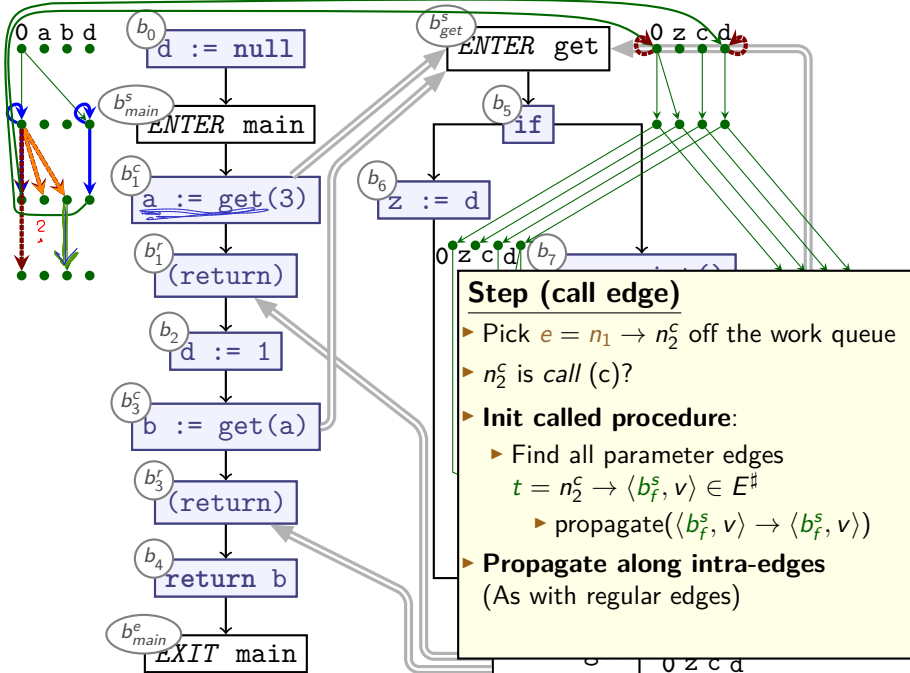




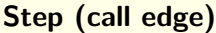




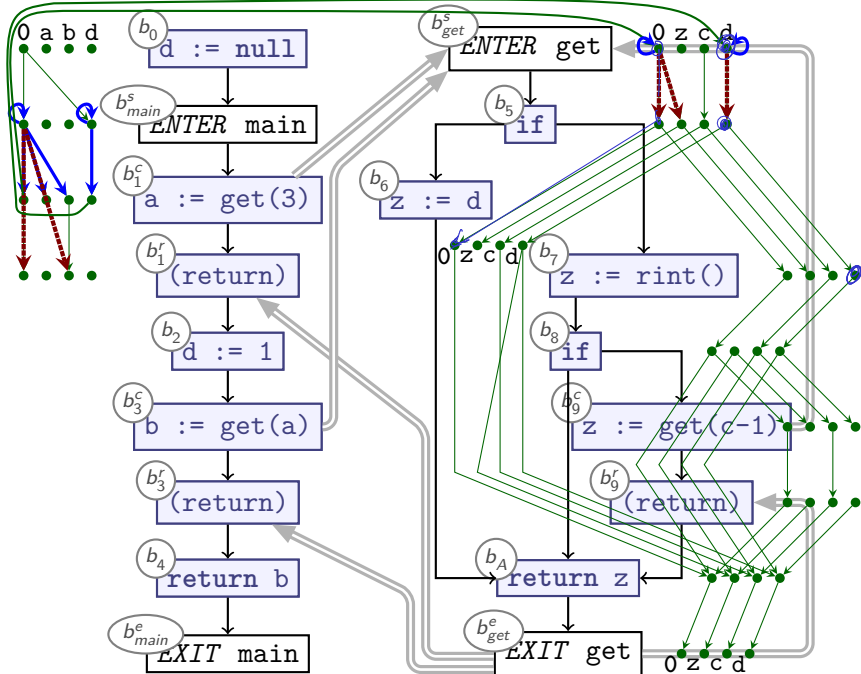


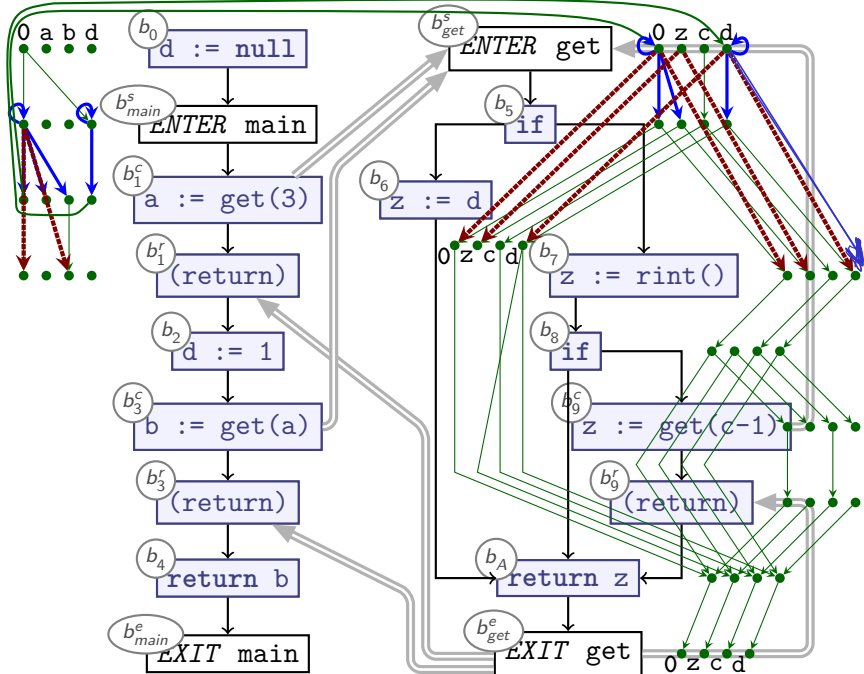




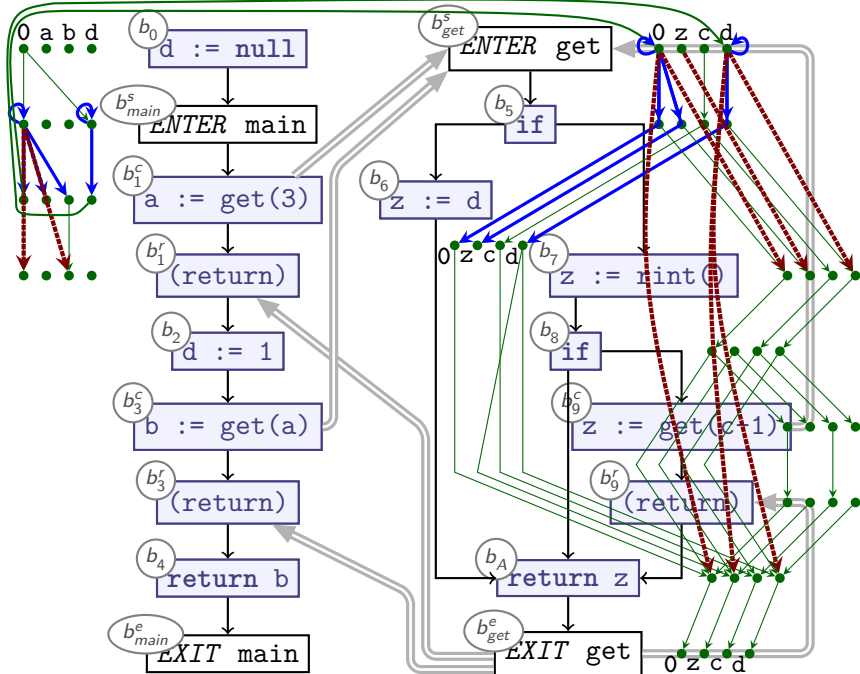


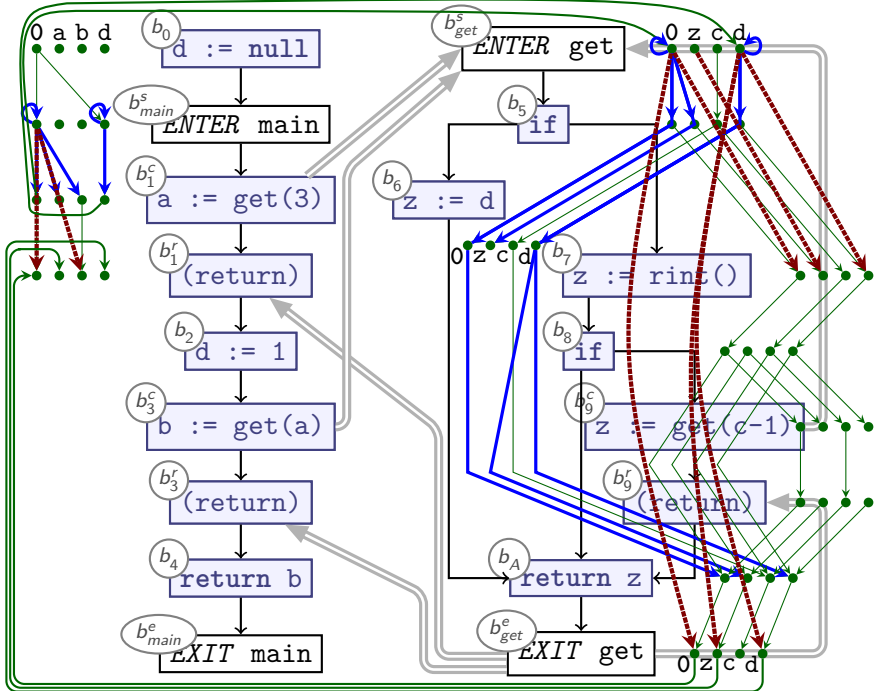
- |   |   |   |   |   |
|---|---|---|---|---|
| 0 | 0 | 2 | c | d |
|---|---|---|---|---|

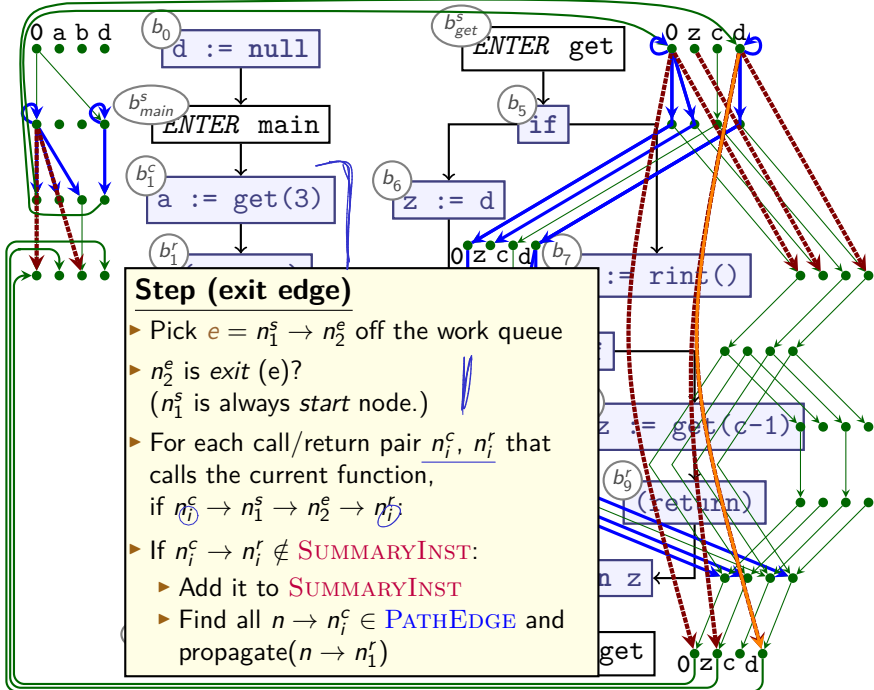


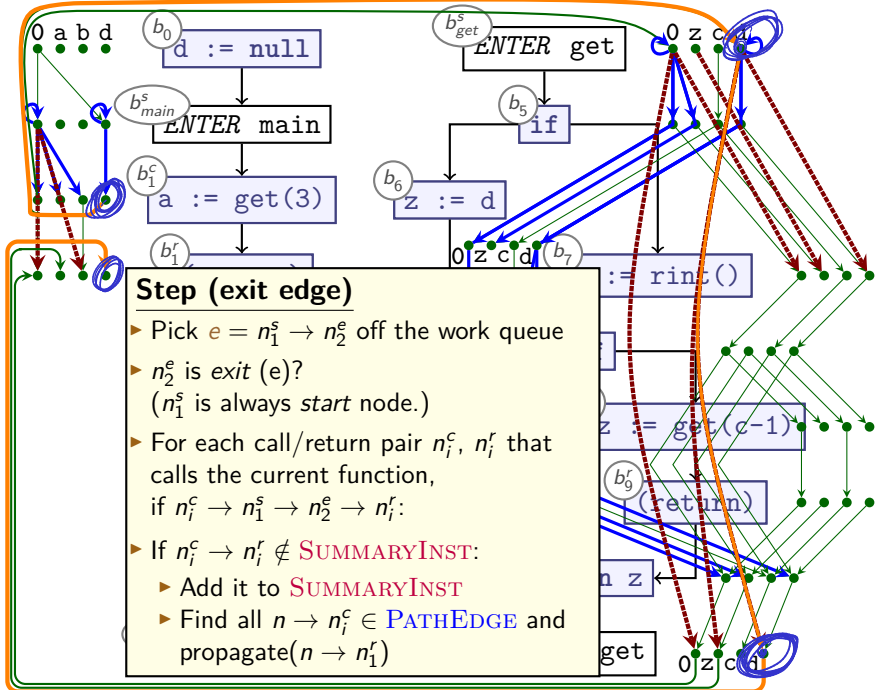


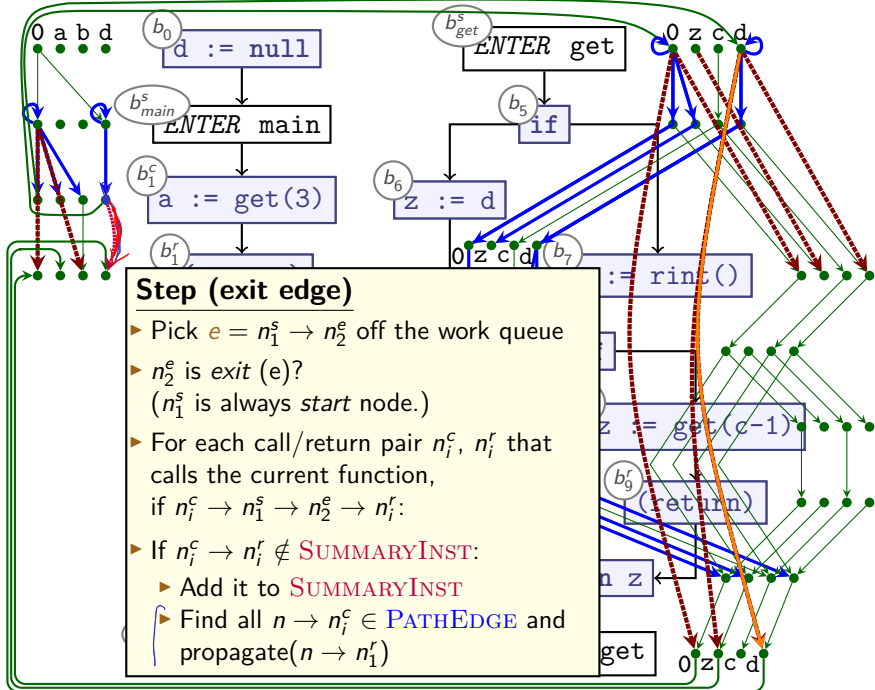


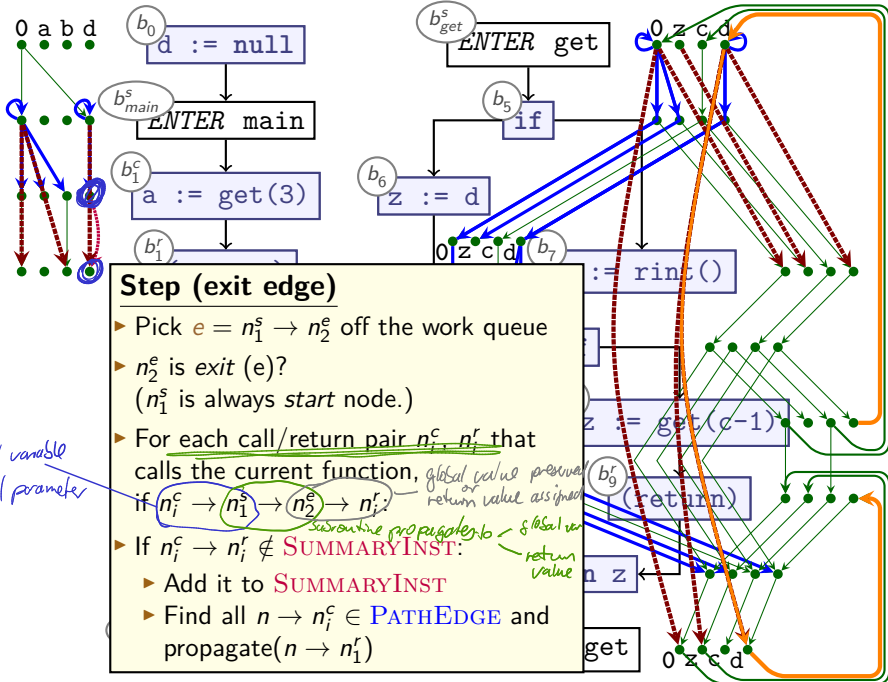


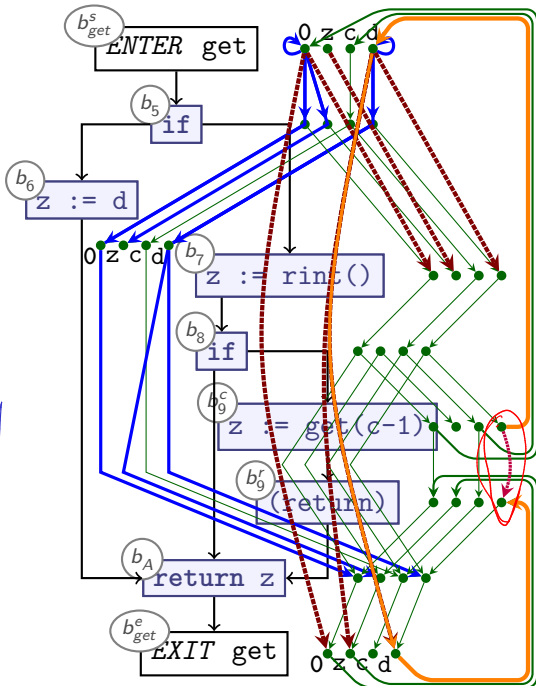
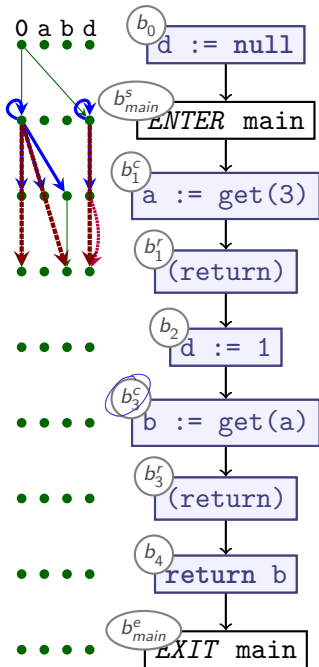


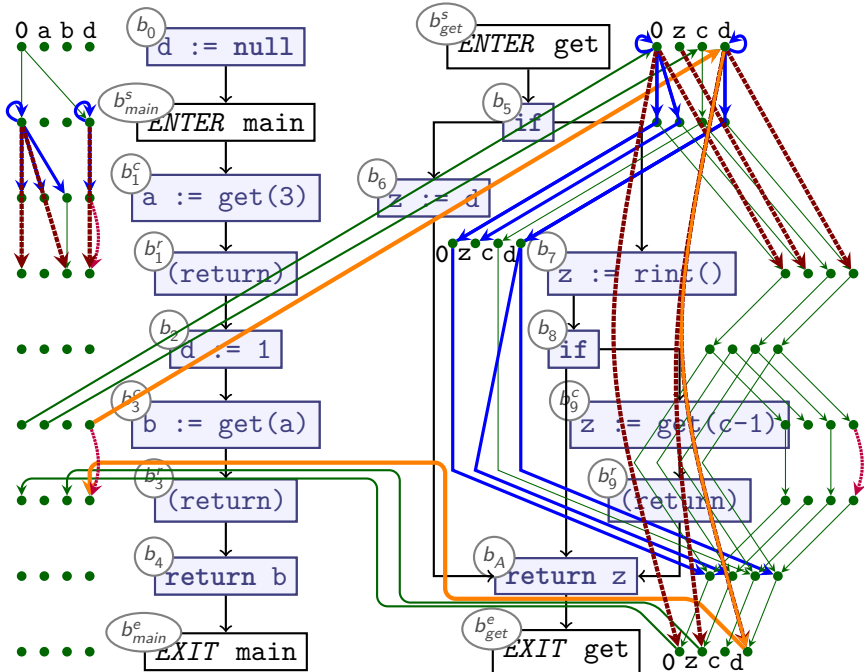




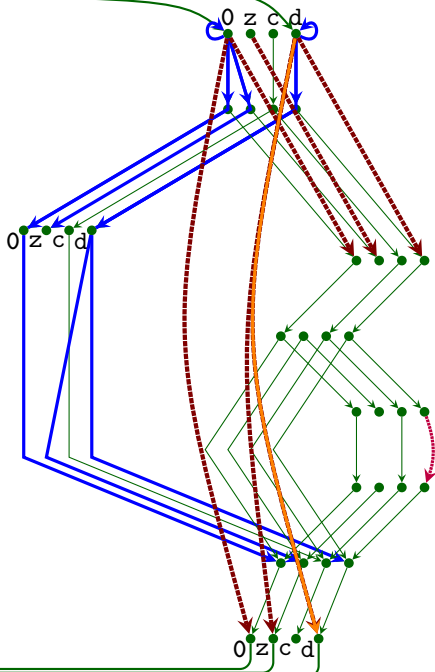
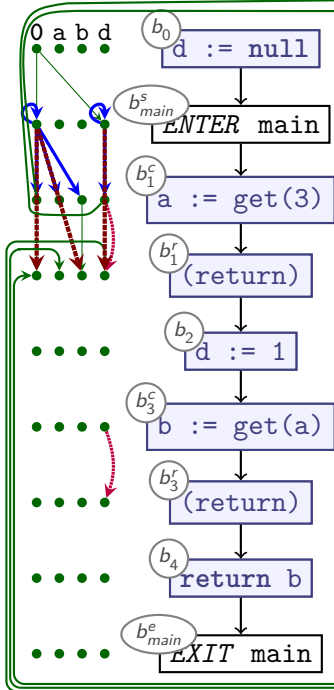


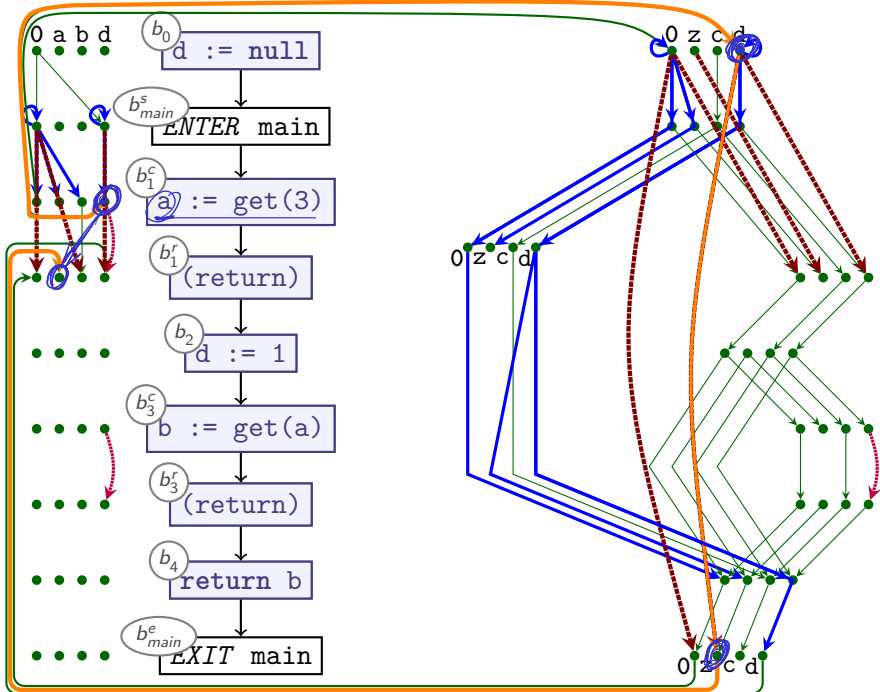


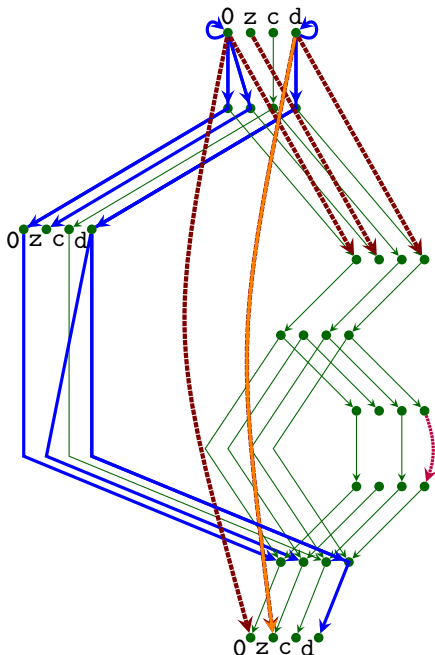
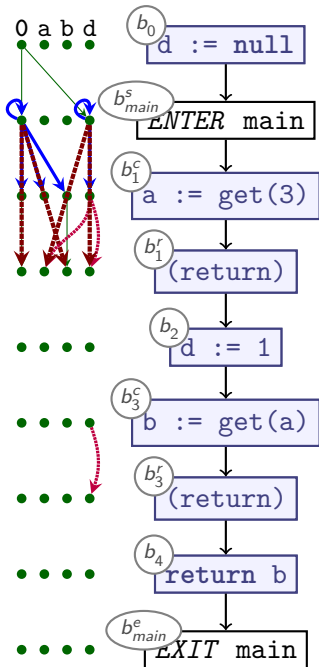


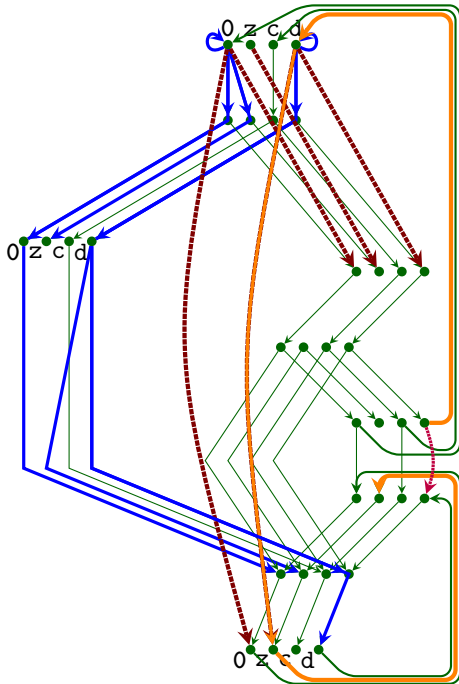
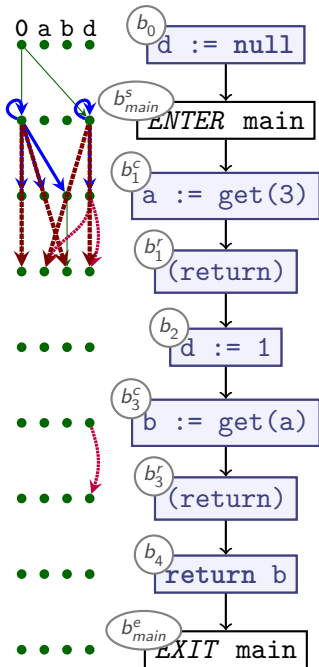


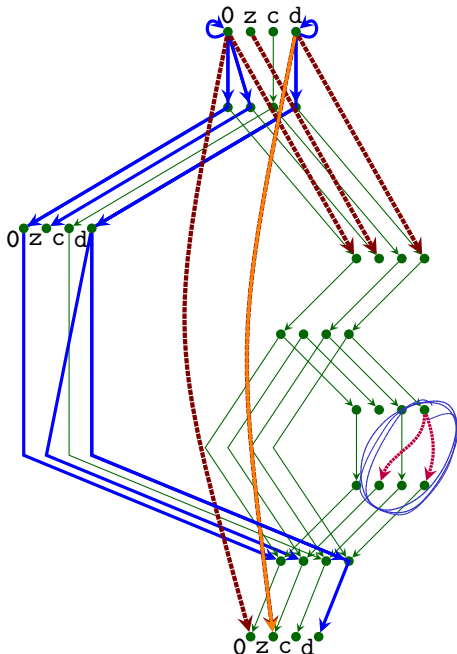
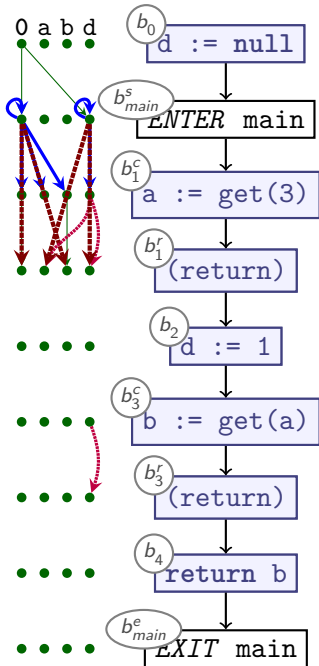


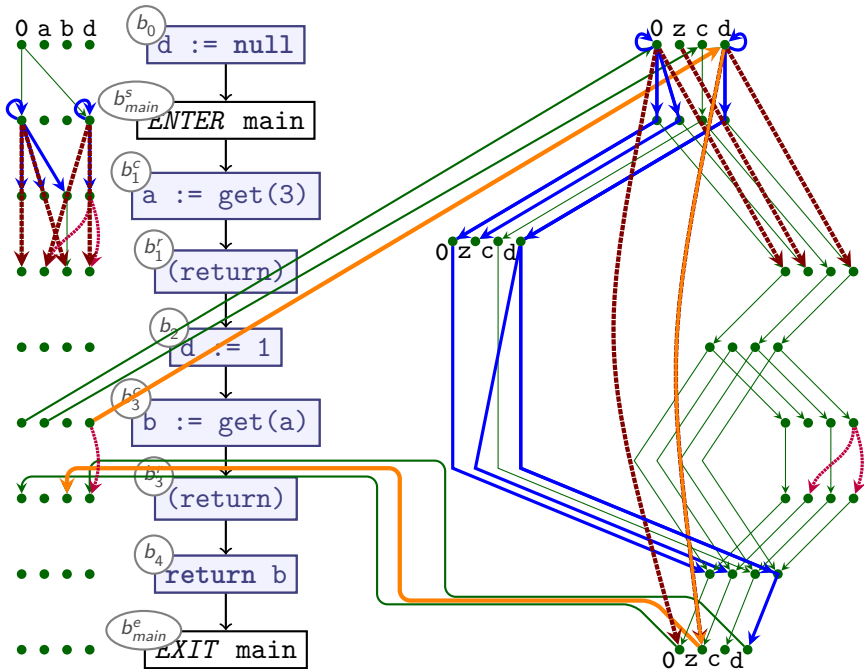




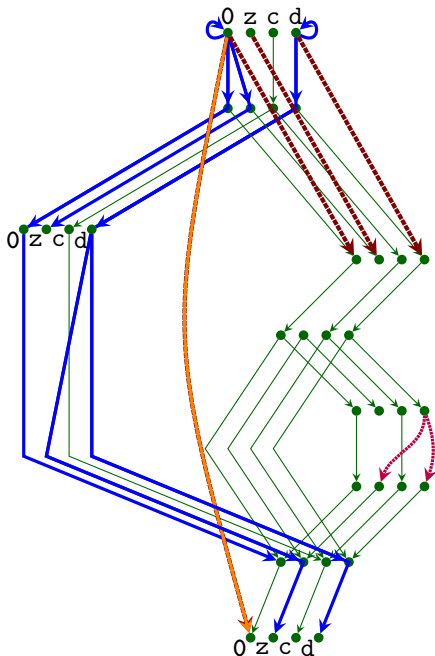
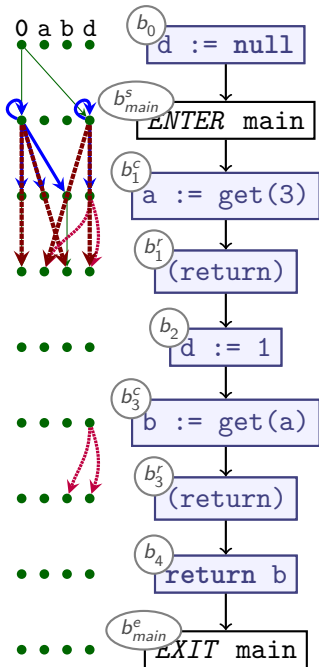




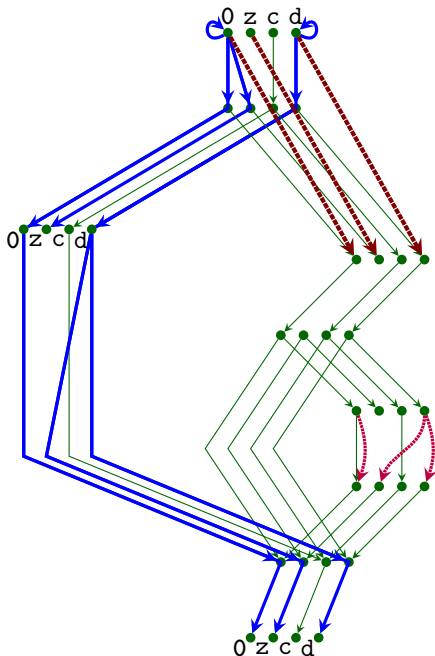
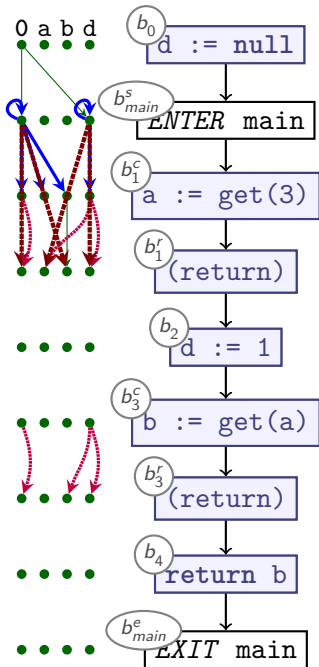


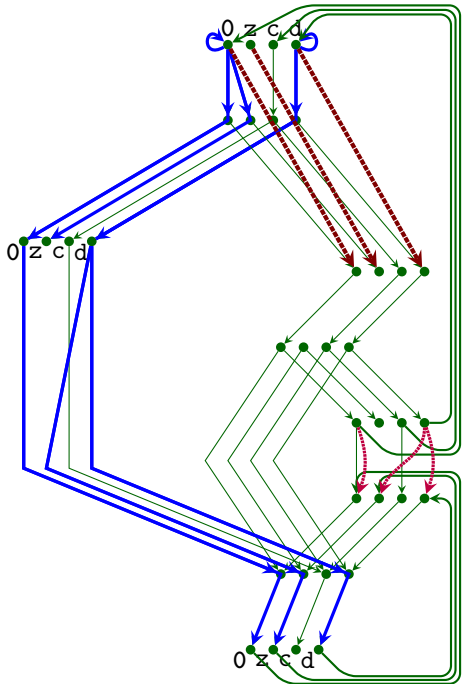
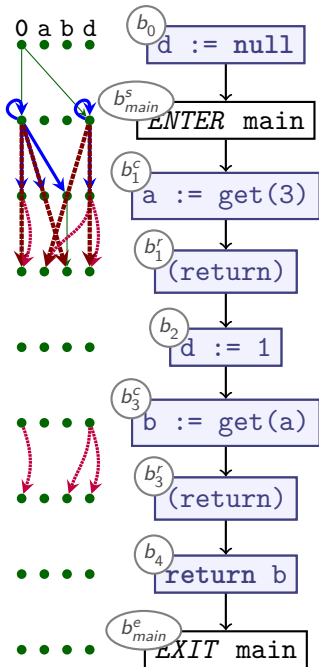


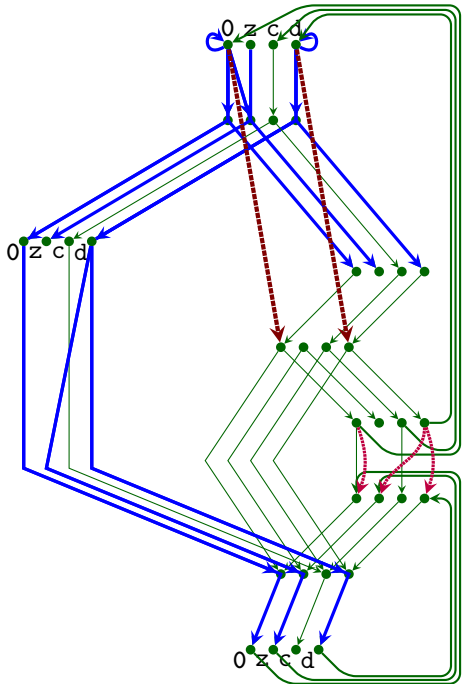
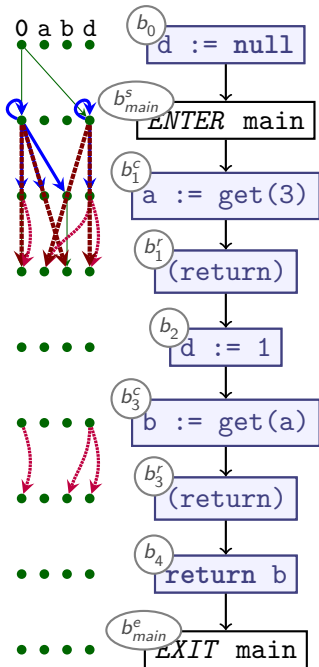


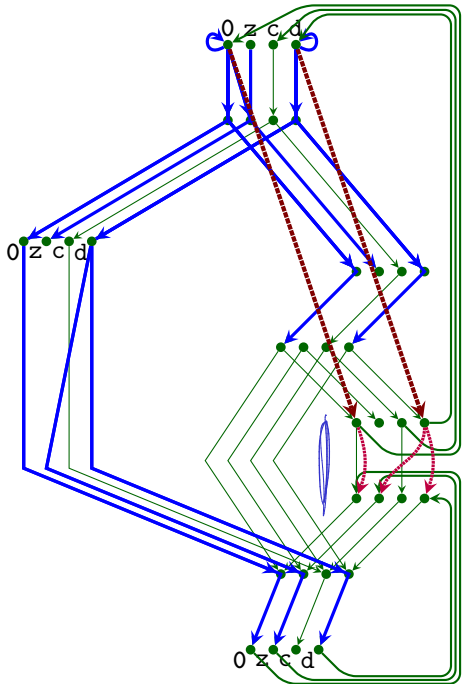
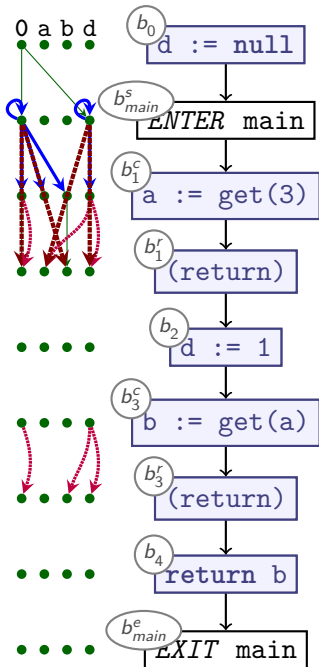


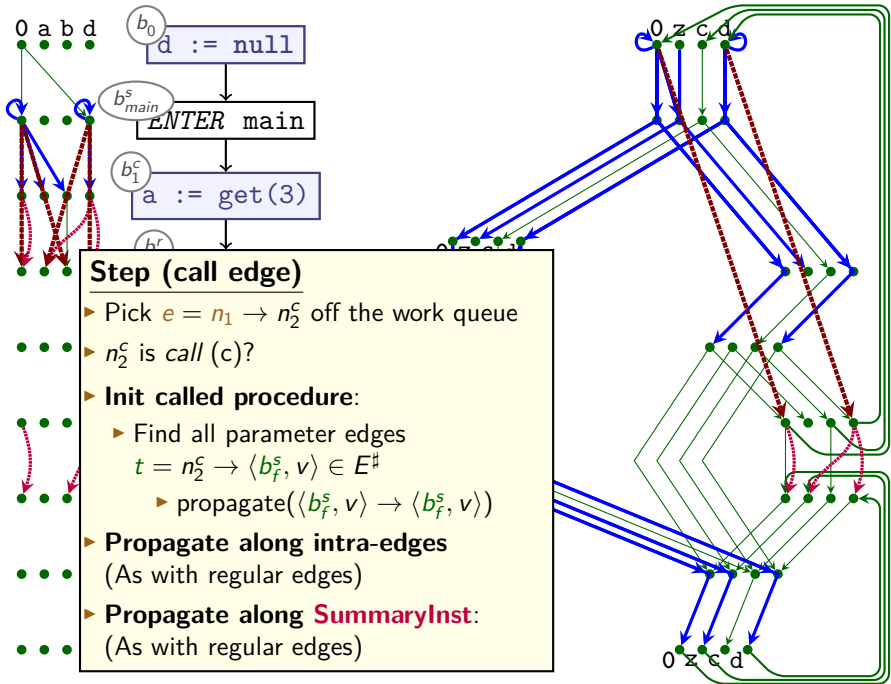


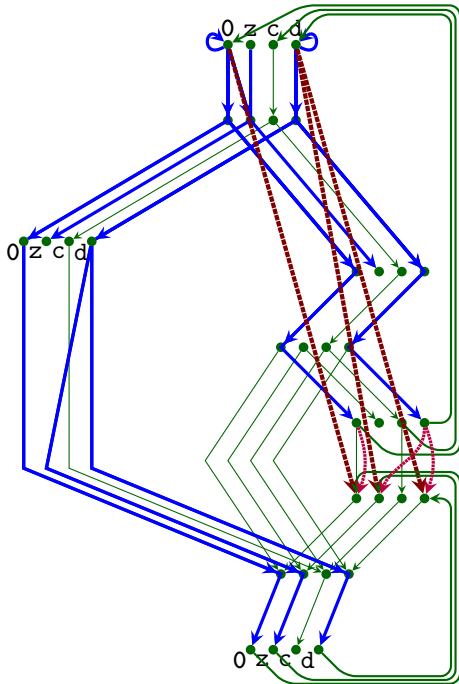
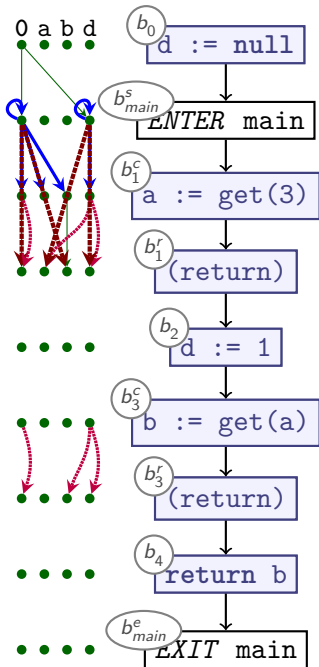


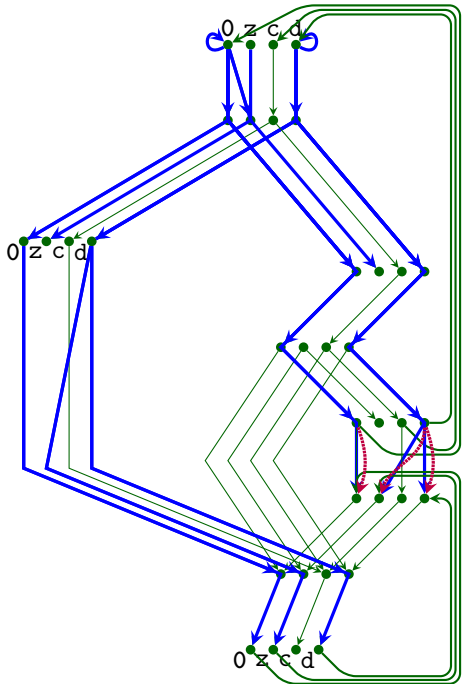
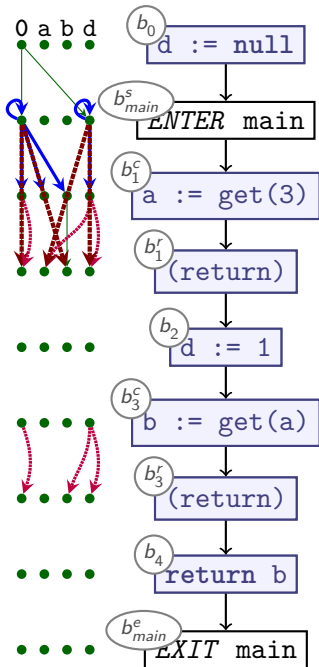


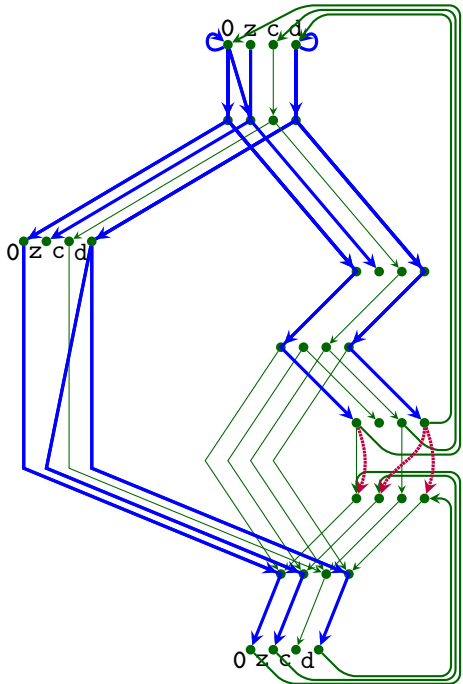
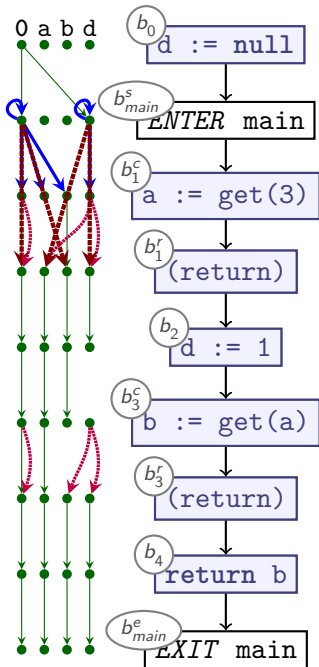




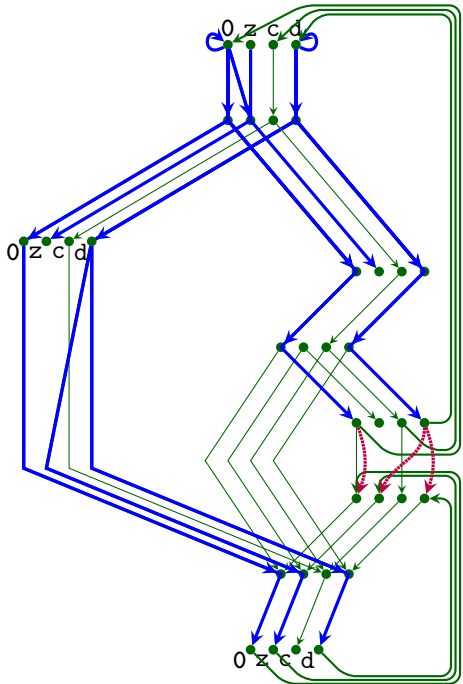
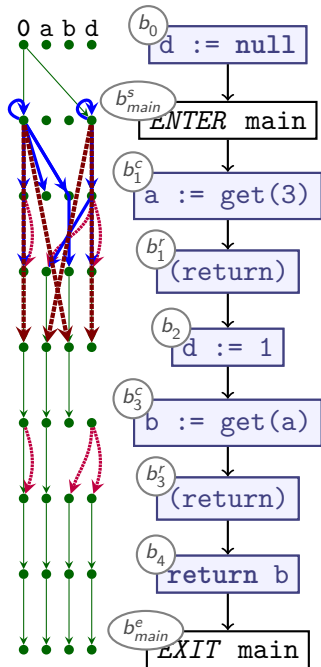


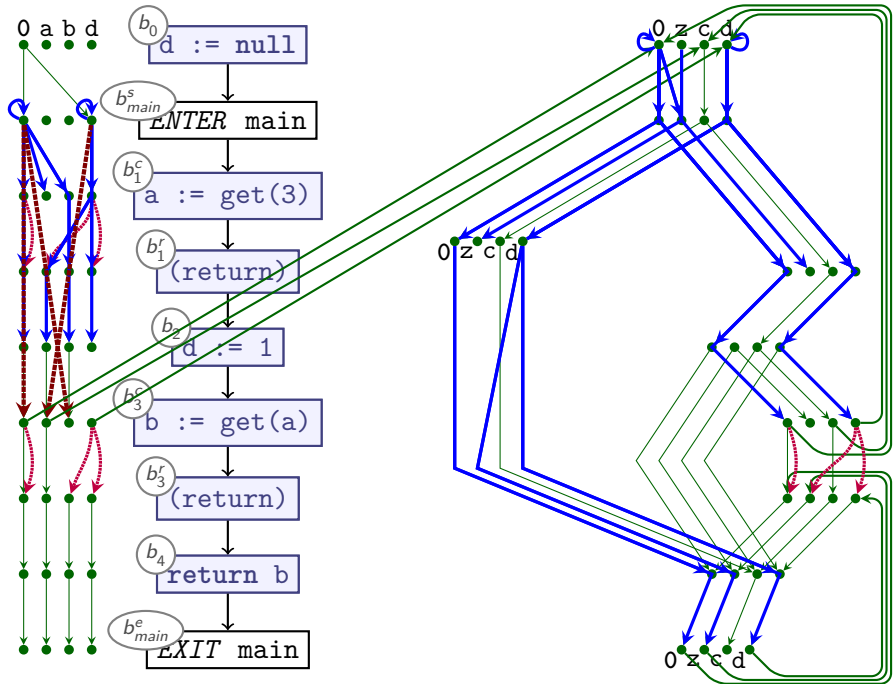


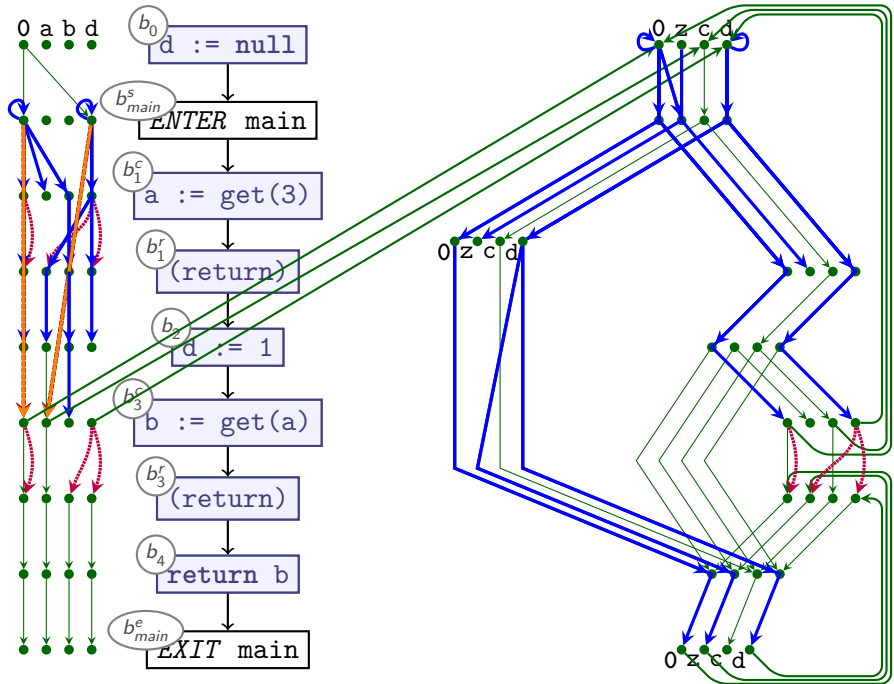


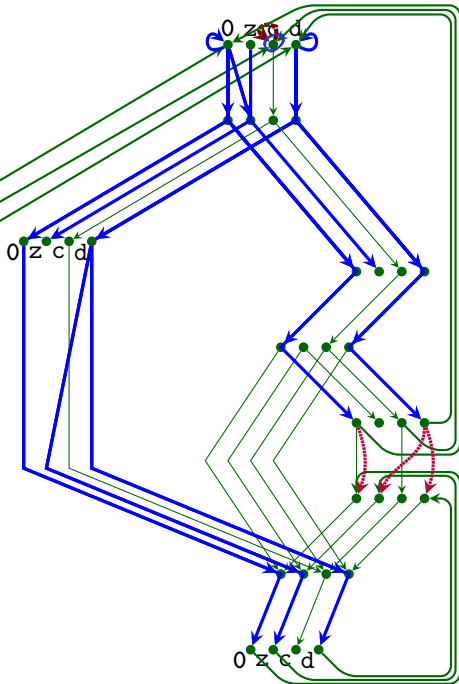
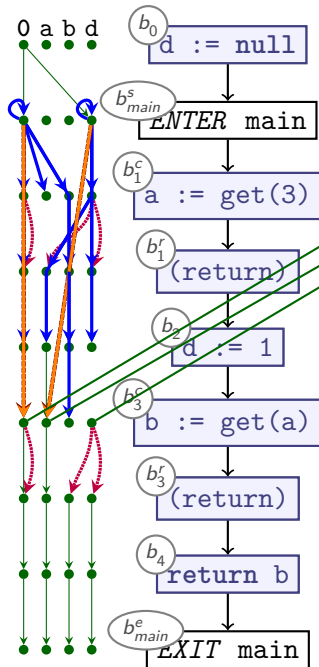


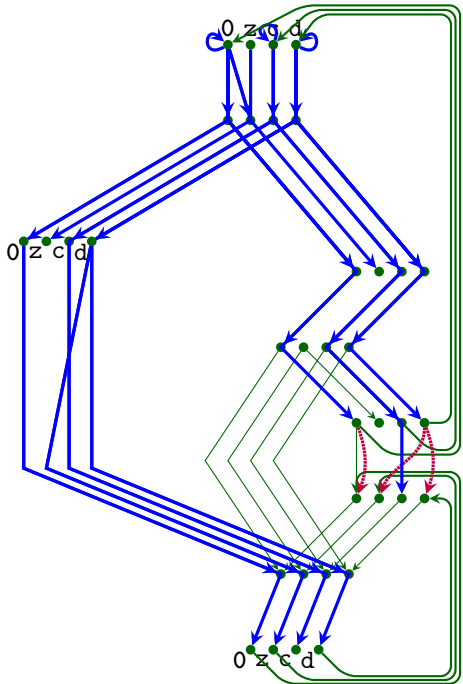
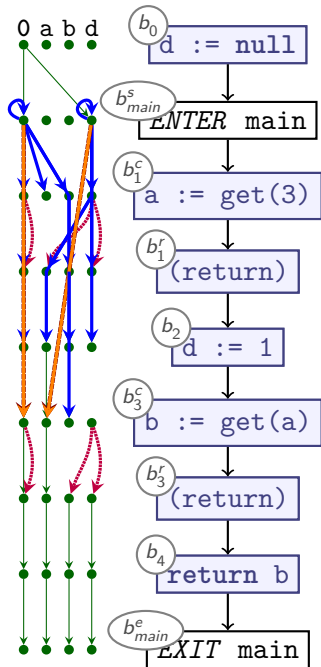


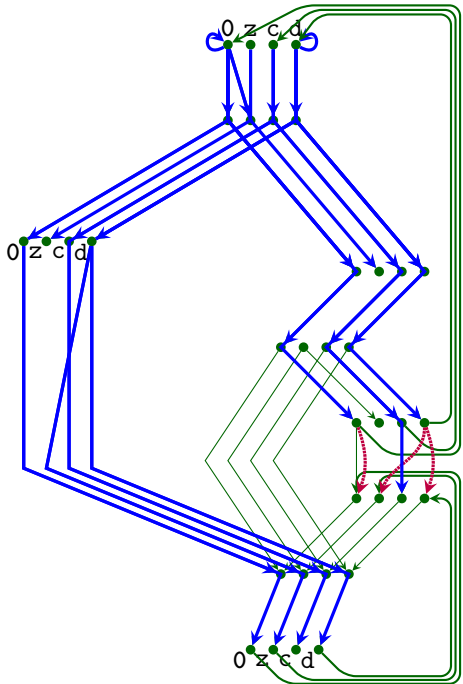
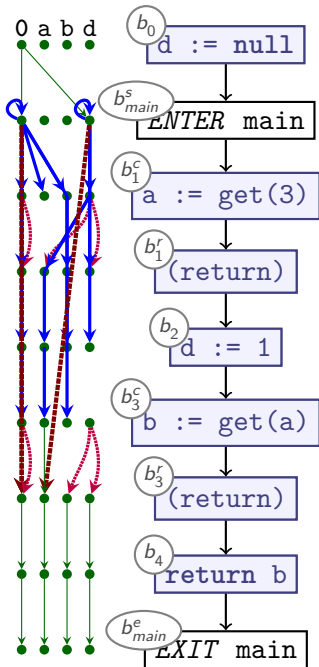


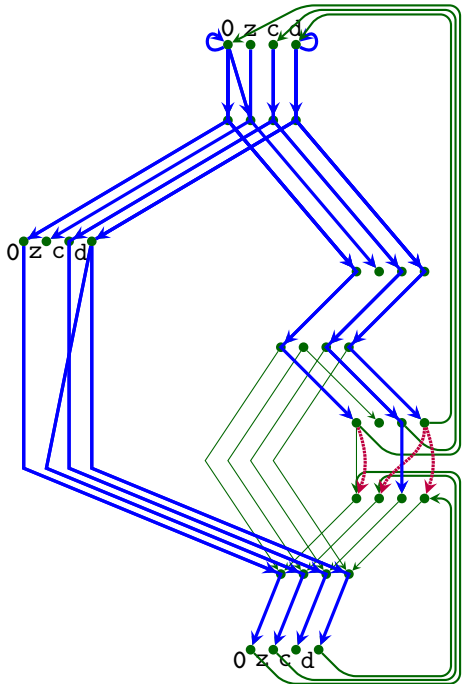
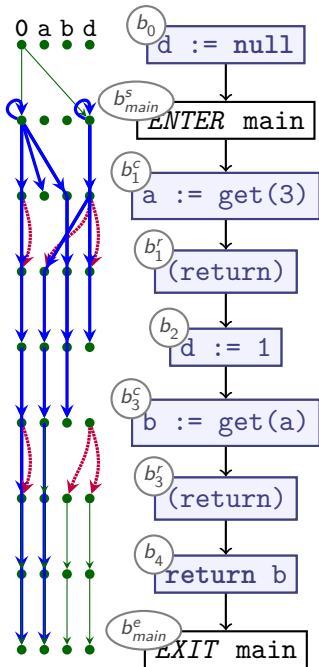


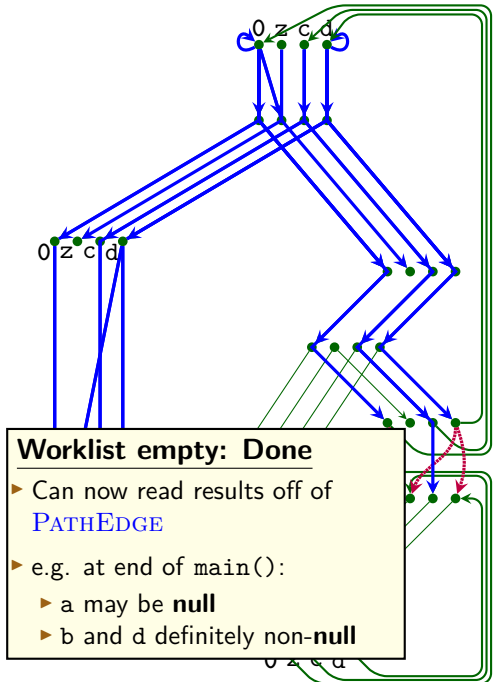
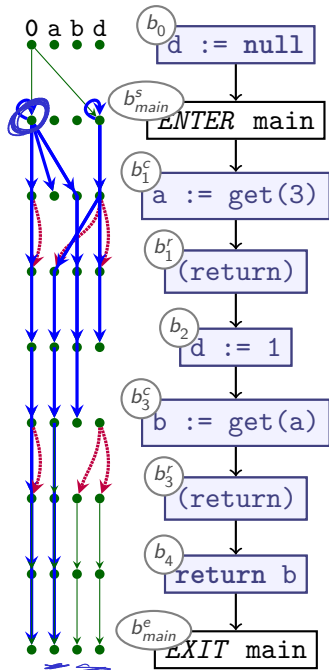














# The IFDS Algorithm: Initialisation and Propagation)

**Procedure** Init():

**begin**

**WORKLIST** := **PATHEDGE** :=  $\emptyset$

propagate( $\langle b_{\text{main}}^s, \mathbf{0} \rangle \rightarrow \langle b_{\text{main}}^s, \mathbf{0} \rangle$ )

ForwardTabulate()

**end**

**Procedure** propagate( $n_1 \rightarrow n_2$ ):

**begin**

**if**  $n_1 \rightarrow n_2 \in \mathbf{PATHEDGE}$  **then**

**return**

**PATHEDGE** := **PATHEDGE**  $\cup \{n_1 \rightarrow n_2\}$

**WORKLIST** := **WORKLIST**  $\cup \{n_1 \rightarrow n_2\}$

**end**

# IFDS: Forward Tabulation

**Procedure** ForwardTabulate():

**begin**

**while**  $n_0 \rightarrow n_1 \in \text{WORKLIST}$  **do**

**WorkList** := **WorkList**  $\setminus \{n_0 \rightarrow n_1\}$

$\langle b_0, v_0 \rangle = n_0$ ;  $\langle b_1, v_1 \rangle = n_1$

**if**  $b_1$  is neither *Call* nor *Exit* node **then**

**foreach**  $n_1 \rightarrow n_2 \in E^\#$ :

propagate( $n_0 \rightarrow n_2$ )

**else if**  $b_1$  is *Call* node **then begin**

**foreach** call edge  $n_1 \rightarrow n_2 \in E^\#$ :

propagate( $n_2 \rightarrow n_2$ )

**foreach** non-call edge  $n_1 \rightarrow n_2 \in E^\# \cup \text{SUMMARYINST}$ :

propagate( $n_0 \rightarrow n_2$ )

**end else if**  $b_1$  is *Exit* node **then begin**

**foreach** caller/return node pair  $b_i^c, b_i^r$  that calls  $b_0$  **and** vars  $v_0, v_1$  **do**

$n_s = \langle b_i^c, v_0 \rangle$ ;  $n_r = \langle b_i^r, v_1 \rangle$

**if**  $\{n_s \rightarrow n_0, n_0 \rightarrow n_1, n_1 \rightarrow n_r\} \subseteq E^\#$  **and not**  $n_s \rightarrow n_r \in \text{SUMMARYINST}$  **then**

**SUMMARYINST** := **SUMMARYINST**  $\cup \{n_s \rightarrow n_r\}$

**foreach**  $n_z \rightarrow n_s \in \text{PATHEDGE}$ :

propagate( $n_z, n_r$ )

**end done end done end**

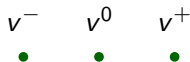
# Summary: IFDS Algorithm

- ▶ Computes yes-or-no analysis on all variables
  - ▶ Original notion of 'variables' is slightly broader)
- ▶ Represents facts-of-interest as nodes  $\langle b, v \rangle$ :
  - ▶  $b$  is node (basic block) in CFG
  - ▶  $v$  is variable that we are interested in
- ▶ Uses
  - ▶ '*Exploded Supergraph*'  $G^\#$ 
    - ▶ All CFGs in program in one graph
    - ▶ Plus interprocedural call edges
  - ▶ *Representation relations*
  - ▶ *Graph reachability*
  - ▶ *A worklist*
- ▶ Distinguishes between *Call* nodes, *Exit* nodes, others
- ▶ **Demand-driven**: only analyses what it needs
- ▶ **Whole-program analysis**
- ▶ **Computes Least Fixpoint on distributive frameworks**

# Beyond True and False

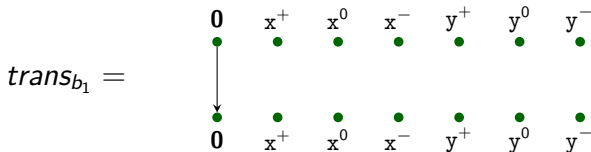
- ▶ What if abstract domain is not boolean?
  - ▶ e.g.,  $\{\top, A^+, A^-, A^0, \perp\}$

# Beyond True and False

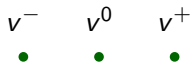


- ▶ What if abstract domain is not boolean?
  - ▶ e.g.,  $\{\top, A^+, A^-, A^0, \perp\}$
- ▶ Multiple boolean properties per variable
  - ▶ easy for powerset lattice  $\mathcal{P}(\{+, -, 0\})$
- ▶ *Limitation*: Transfer functions only depend on one variable
- ▶ Some problems not representable, others must adapt lattice

Consider  $b_1 = \boxed{y := 0 - x}$ :

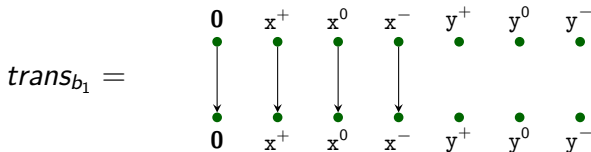


# Beyond True and False



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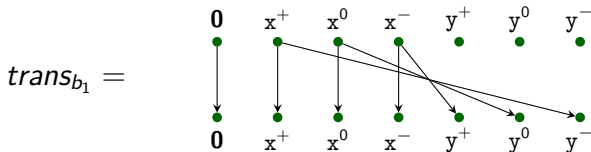


# Beyond True and False



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- ▶ Some problems not representable, others must adapt lattice

Consider  $b_1 = \boxed{y := 0 - x}$ :



# Extending IFDS?

- ▶ Not all analyses map well to IFDS
- ▶ Core ideas are appealing:
  - ▶ Automatically compute procedure summaries
  - ▶ Exploit graph reachability + worklist for *dependency tracking*



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  - ▶ Exploit graph reachability + worklist for *dependency tracking*

**It is possible to extend this to other classes of problems**

# Linear Reaching Values

Statement	$\text{in}_b$	$\text{out}_b$
$x := 42$	$M$	$\{[x \mapsto 42]\} \cup (M \setminus [x \mapsto \_])$
$x := y + 1$	$M = \{[y \mapsto c], \dots\}$	$\{[x \mapsto c + 1]\} \cup (M \setminus [x \mapsto \_])$
$x := y * 7$	$M = \{[y \mapsto c], \dots\}$	$\{[x \mapsto c \times 7]\} \cup (M \setminus [x \mapsto \_])$
$x := y + z$	$M$	$\{[x \mapsto \perp]\} \cup (M \setminus [x \mapsto \_])$

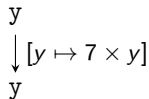
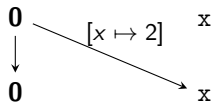
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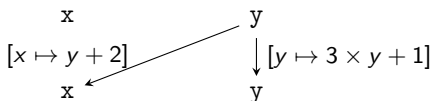
- ▶ The above sketches a *distributive* reaching values analysis
  - ▶ Each annotation of form  $v_1 \mapsto c_1 \times v_2 + c_2$
  - ▶ Tradeoff: no support for adding / multiplying / ... (multiple variables)
- ▶ Encode in IFDS?

# Labelling Graph Edges

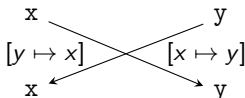
```
x := 2;
y := y * 7;
```



```
x := y + 2;
y := 3 * y + 1;
```

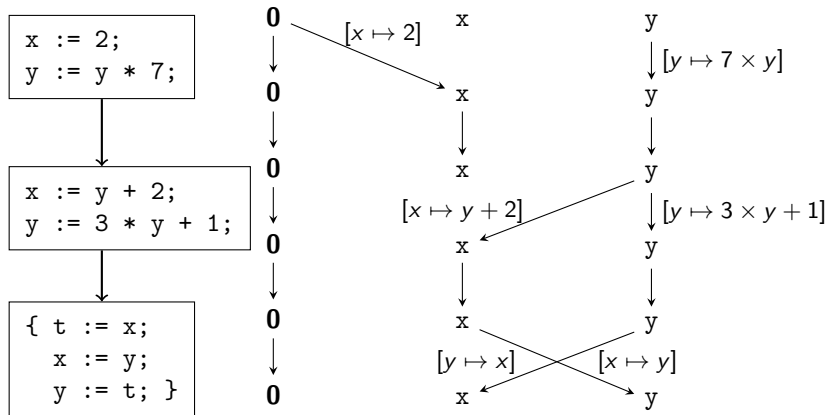


```
{ t := x;
  x := y;
  y := t; }
```



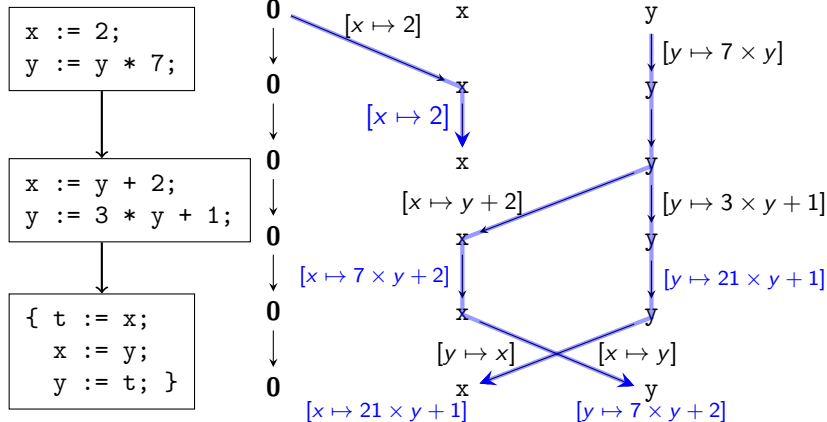
- ▶ Extending IFDS to support information processing
- ▶ Carrying over key techniques:
  - ▶ *Track dependencies*
  - ▶ *Generate procedure summaries on the fly*

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# Labelling Graph Edges



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  - ▶ *Track dependencies*
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# Representation

$$\left\{ \begin{array}{l} [x \mapsto c_{x,1} \times x + d_{x,1}] \\ [y \mapsto c_{y,1} \times y + d_{y,1}] \end{array} \right\} \circ \left\{ \begin{array}{l} [x \mapsto c_{x,2} \times v_1 + d_{x,2}] \\ [y \mapsto c_{y,2} \times v_2 + d_{y,2}] \end{array} \right\} \\ = \\ \left\{ \begin{array}{l} [x \mapsto (c_{x,2} \times c_{x,1}) \times v_1 + (d_{x,2} + c_{x,1} \times d_{x,1})] \\ [y \mapsto (c_{y,2} \times c_{y,1}) \times v_1 + (d_{y,2} + c_{y,1} \times d_{y,1})] \end{array} \right\}$$

- ▶  $c_i, d_i$ : constants
- ▶  $v_i$ : program variables

# Representation

$$\left\{ \begin{array}{l} [x \mapsto c_{x,1} \times x + d_{x,1}] \\ [y \mapsto c_{y,1} \times y + d_{y,1}] \end{array} \right\} \circ \left\{ \begin{array}{l} [x \mapsto c_{x,2} \times v_1 + d_{x,2}] \\ [y \mapsto c_{y,2} \times v_2 + d_{y,2}] \end{array} \right\} \\ = \\ \left\{ \begin{array}{l} [x \mapsto (c_{x,2} \times c_{x,1}) \times v_1 + (d_{x,2} + c_{x,1} \times d_{x,1})] \\ [y \mapsto (c_{y,2} \times c_{y,1}) \times v_1 + (d_{y,2} + c_{y,1} \times d_{y,1})] \end{array} \right\}$$

- ▶  $c_i, d_i$ : constants
- ▶  $v_i$ : program variables
- ▶ (Maps of) linear functions are closed under composition



# Representation

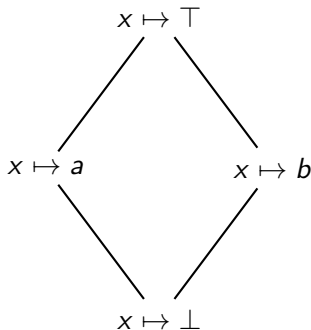
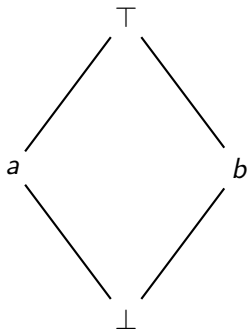
$$\left\{ \begin{array}{l} [x \mapsto c_{x,1} \times x + d_{x,1}] \\ [y \mapsto c_{y,1} \times y + d_{y,1}] \end{array} \right\} \circ \left\{ \begin{array}{l} [x \mapsto c_{x,2} \times v_1 + d_{x,2}] \\ [y \mapsto c_{y,2} \times v_2 + d_{y,2}] \end{array} \right\} \\ = \\ \left\{ \begin{array}{l} [x \mapsto (c_{x,2} \times c_{x,1}) \times v_1 + (d_{x,2} + c_{x,1} \times d_{x,1})] \\ [y \mapsto (c_{y,2} \times c_{y,1}) \times v_1 + (d_{y,2} + c_{y,1} \times d_{y,1})] \end{array} \right\}$$

- ▶  $c_i, d_i$ : constants
- ▶  $v_i$ : program variables
- ▶ (Maps of) linear functions are closed under composition
- ▶ Must support  $\sqcup$  to merge, map to  $\top$  on mismatch

$$\left\{ \begin{array}{l} [x \mapsto c_{x,1} \times v_1 + d_{x,1}] \\ [y \mapsto c_{y,1} \times v_3 + d_{y,1}] \end{array} \right\} \sqcup \left\{ \begin{array}{l} [x \mapsto c_{x,1} \times v_1 + d_{x,1}] \\ [y \mapsto c_{y,2} \times v_2 + d_{y,2}] \end{array} \right\} \\ = \\ \left\{ \begin{array}{l} [x \mapsto c_{x,1} \times x + d_{x,1}] \\ [y \mapsto \perp] \end{array} \right\}$$

# Micro-Functions and Lattices

- Extend lattices to such 'Micro-Functions':



# Micro-Functions, Efficient Representation

- ▶ Micro-Functions must support:

Encoding

Computation  $f(x)$

Equality testing  $f = f'$

Composition  $f \circ f'$

Meet  $f \sqcup f'$

- ▶ Other examples:

- ▶ IFDS problems
- ▶ Value bounds analysis

# Micro-Functions, Efficient Representation

- ▶ Micro-Functions must support:

Encoding		$O(1)$ space
Computation	$f(x)$	$O(1)$ time
Equality testing	$f = f'$	$O(1)$ time
Composition	$f \circ f'$	$O(1)$ time
Meet	$f \sqcup f'$	$O(1)$ time

- ▶ Micro-functions are **efficiently representable** if they satisfy space / time constraints
  - ▶ Required for the algorithm's time bounds
- ▶ Other examples:
  - ▶ IFDS problems
  - ▶ Value bounds analysis

# The IDE Algorithm (1/1)

- ▶ Interprocedural **D**istributive **E**nvironments algorithm
- ▶ Extends IFDS to 'labelled' edges as described above
- ▶ Assumes distributive framework over micro-functions
- ▶ Algorithmic changes:
  - ▶ First phase analogous to IFDS
  - ▶ Second phase applies computed functions to read out results
- ▶ Maintain/update mapping from path edges to micro-functions  $f$ :

$$\text{PATHEDGE} = \{ \langle b_0, v_0 \rangle \xrightarrow{f_0} \langle b_1, v_1 \rangle, \dots \}$$

- ▶ 'Missing edges' equivalent to  $x \mapsto \perp$
- ▶ Initialise:

$$\text{PATHEDGE} = \{ \langle b_0, v_0 \rangle \xrightarrow{v_1 \mapsto \perp} \langle b_1, v_1 \rangle, \dots \}$$

- ▶ Always exactly one  $f$  per  $\{ \langle b_0, v_0 \rangle \xrightarrow{f} \langle b_1, v_1 \rangle \} \in \text{PATHEDGE}$

# The IDE Algorithm (2/2)

**Procedure** propagate( $n_1 \rightarrow n_2$ ): -- IFDS version

**begin**

**if**  $n_1 \rightarrow n_2 \in \text{PATHEDGE}$  **then**

**return**

$\text{PATHEDGE} := \text{PATHEDGE} \cup \{n_1 \rightarrow n_2\}$

$\text{WORKLIST} := \text{WORKLIST} \cup \{n_1 \rightarrow n_2\}$

**end**



**Procedure** propagate<sub>IDE</sub>( $n_1 \xrightarrow{f} n_2$ ): -- IDE version

**begin**

**let**  $n_1 \xrightarrow{f'} n_2 \in \text{PATHEDGE}$

$f_{\text{upd}} := f \sqcup f'$

**if**  $f_{\text{upd}} = f'$  **then**

**return**

$\text{PATHEDGE} := (\text{PATHEDGE} \setminus \{n_1 \xrightarrow{f'} n_2\}) \cup \{n_1 \xrightarrow{f_{\text{upd}}} n_2\}$

$\text{WORKLIST} := \text{WORKLIST} \cup \{n_1 \rightarrow n_2\}$

**end**

# Summary

- ▶ IDE strictly generalises IFDS
- ▶ Utilises **Micro-Functions** to ensure efficient summaries:
  - ▶ Intra-procedural summaries via **PATHEDGE**
  - ▶ Inter-procedural procedure summaries via **SUMMARYINST**
- ▶ Runtime is  $O(LED^3)$  if micro-functions are **efficiently representable**
  - ▶  $L$ : Lattice height
    - ▶ IFDS: 1
    - ▶ IDE: length of longest descending chain
  - ▶  $E$ : Number of control-flow edges
  - ▶  $D$ : Number of variables
- ▶ IFDS supported by many popular dataflow frameworks