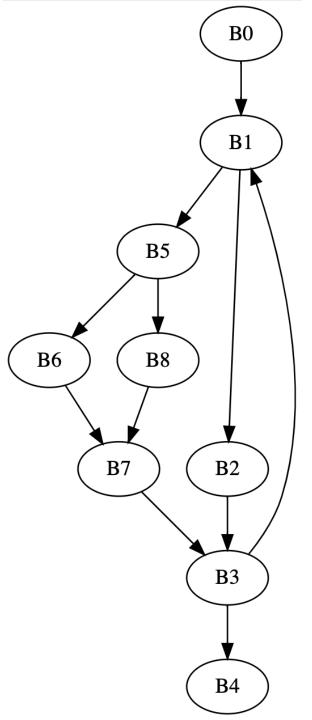
CSE211: Compiler Design Oct. 27, 2020

- Topic: Data Flow Analysis Continued
- Questions:

Questions/comments about homework 1?

What are some interesting control flow constructs and how do they look in a CFG?



Announcements

- Homework 1 is due on Thursday!
- Office Hours are Wednesday from 3 4 PM.
- If you need help with homework 1, message me before hand with a brief summary of your question. I will use this to schedule and potentially make groups

Announcements

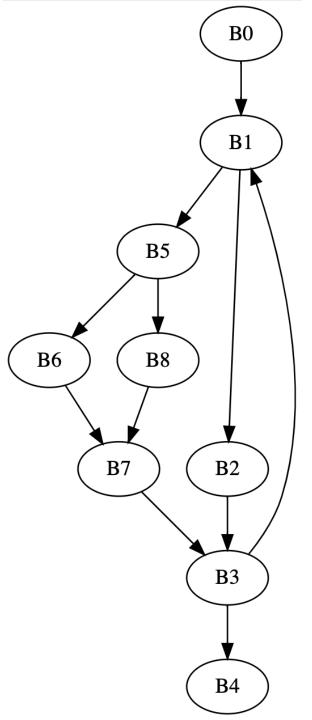
- According to the schedule: the last day of module 2.
- But we need to go over SSA form
- Schedule may get moved back a week. (I know people are excited for module 3!)

CSE211: Compiler Design Oct. 27, 2020

- Topic: Data Flow Analysis Continued
- Questions:

Questions/comments about homework 1?

What are some interesting control flow constructs and how do they look in a CFG?



Control Flow Graphs

A graph where:

- nodes are basic blocks
- edges mean that it is possible for one block to branch to another

stä	art	:		
r0	=	• • •	;	
r1	=	• • •	;	
br	r0	, i.	f,	else;
	=	 d_i.		
els	se:			

r3 = ...;

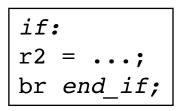
end_if: r4 = ...;

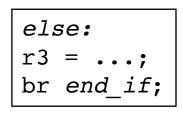
Control Flow Graphs

A graph where:

- nodes are basic blocks
- edges mean that it is possible for one block to branch to another

sta	art:
r0	=;
r1	=;
br	r0, if, else;

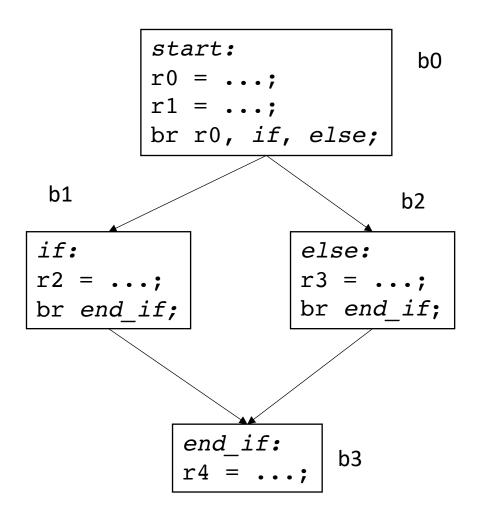




Control Flow Graphs

A graph where:

- nodes are basic blocks
- edges mean that it is possible for one block to branch to another



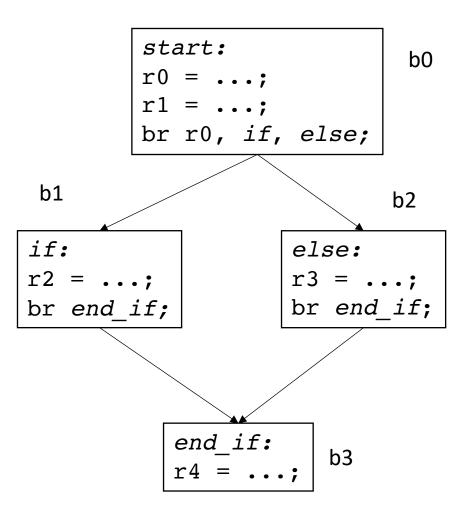
Interesting CFGs

interesting CFGs

- Exceptions
- Break in a loop
- Switch statement (consider break, no break)
- first class branches (or functions)

Dominance

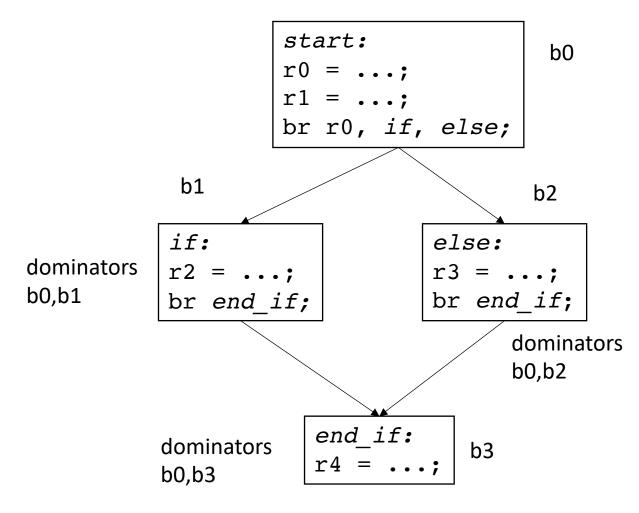
 a block b_x dominates block b_y iff every path from the start to block b_x goes through b_y



dominators b0

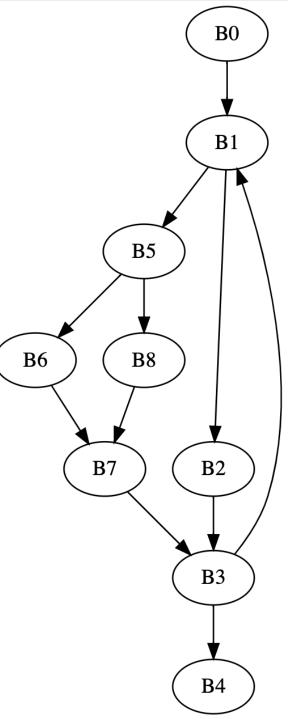
Dominance

 a block b_x dominates block b_y iff every path from the start to block b_x goes through b_y



a larger example from last lecture

Node	Dominators
ВО	BO
B1	B0, B1
B2	B0, B1, B2
B3	B0, B1, B3
B4	B0, B1, B3, B4
B5	B0, B1, B5
B6	B0, B1, B5, B6
B7	B0, B1, B5, B7
B8	B0, B1, B5, B8



Computing Dominance

- Iterative fixed point algorithm
- Initial state, all nodes start with all other nodes are dominators:
 - *Dom(n)* = *N*
 - Dom(start) = {start}

iteratively compute:

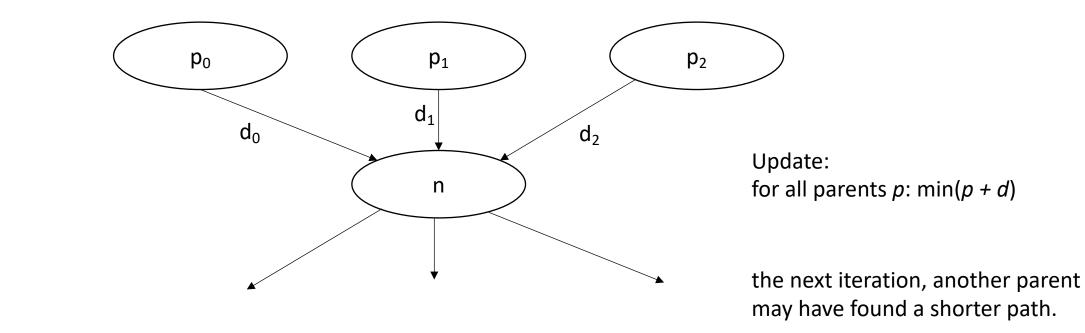
$$Dom(n) = \{n\} \cup (\bigcap_{\min preds(n)} Dom(m))$$

Building intuition behind the math

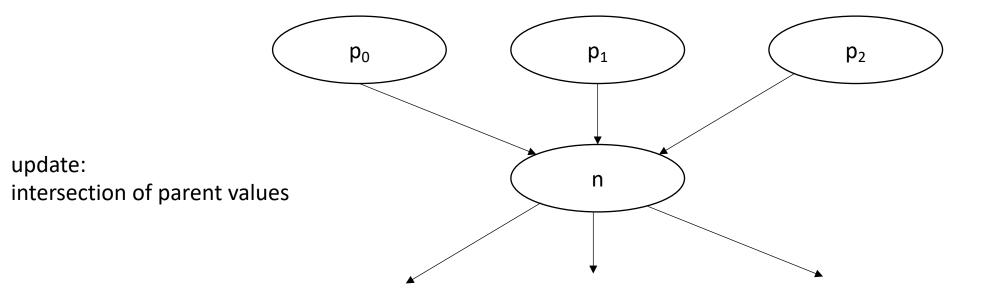
- This algorithm is vertex centric
 - local computations consider only a target node and its immediate neighbors
- At least one node is instantiated with ground truth:
 - starting node dominator is itself
- Information flows through the graphs and nodes are updated

For example: Bellman Ford Shortest path

- Root node is initialized to 0
- Every node determines new distances based on incoming distances.
- When distances stop updating, the algorithm is converged



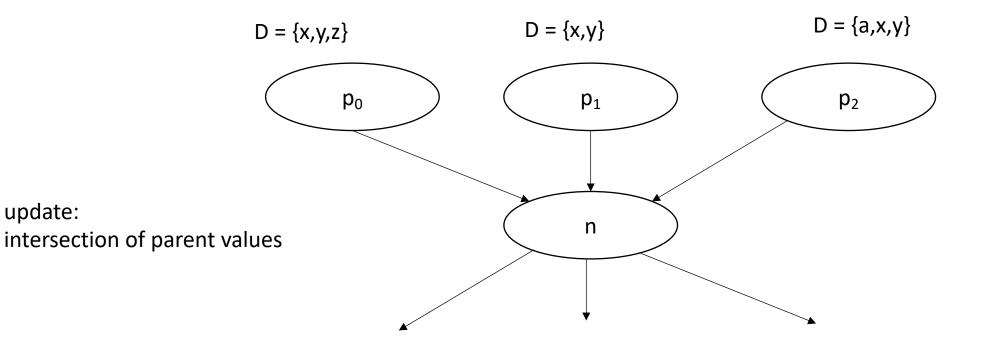
- Root node is initialized to itself
- Every node determines new dominators based on parent dominators



Root node is initialized to itself

update:

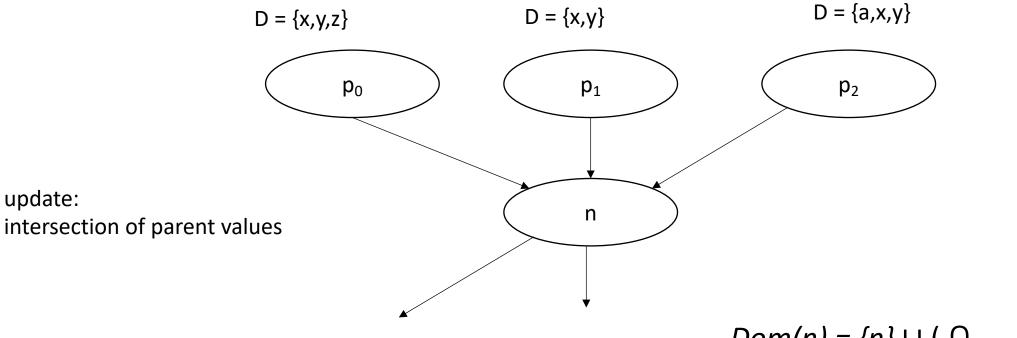
• Every node determines new dominators based on parent dominators



Root node is initialized to itself

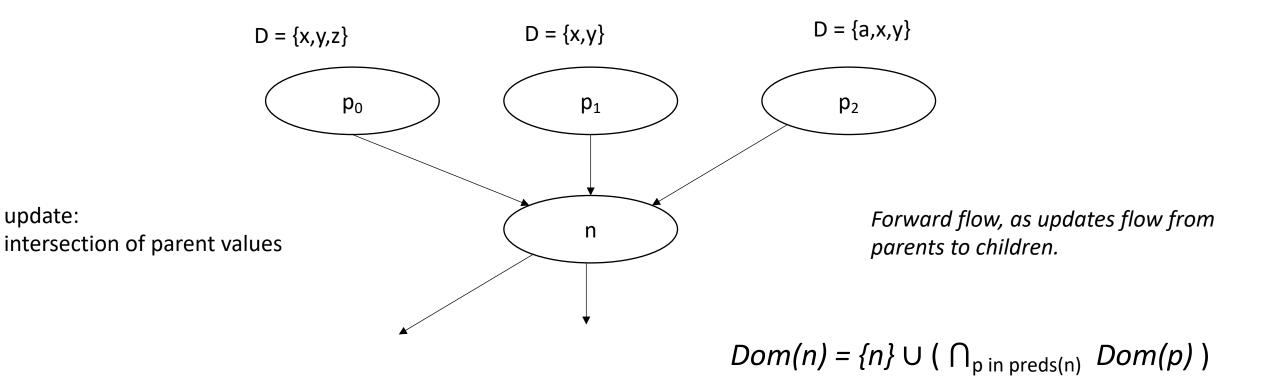
update:

• Every node determines new dominators based on parent dominators

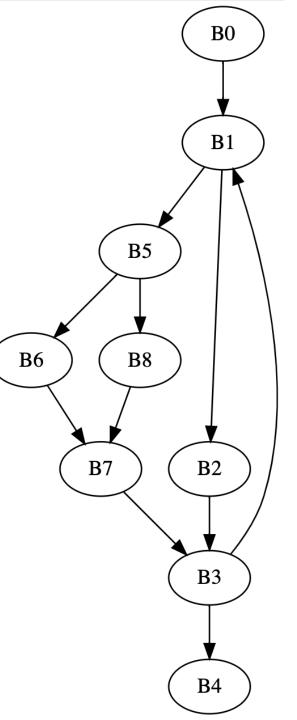


 $Dom(n) = \{n\} \cup (\bigcap_{p \text{ in preds}(n)} Dom(p))$

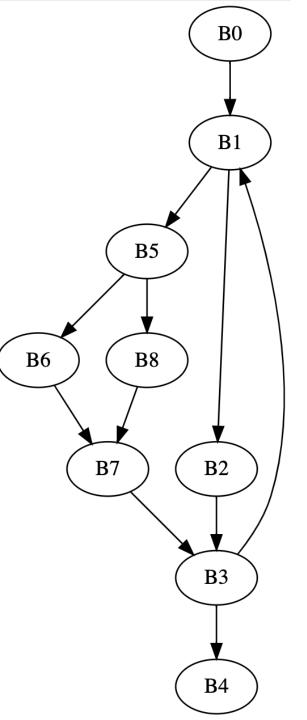
- Root node is initialized to itself
- Every node determines new dominators based on parent dominators



Node	Initial	11	12	13
во	BO	B0		•••
B1	N	B0,B1		
B2	N	B0,B1,B2		
B3	N	B0,B1,B2,B3	B0,B1,B3	
B4	N	B0,B1,B2,B3,B4	B0,B1,B3,B4	
B5	Ν	B0,B1,B5		
B6	N	B0,B1,B5,B6		
B7	N	B0,B1,B5,B6,B7	B0,B1,B5,B7	
B8	Ν	B0,B1,B5,B8		



Node	Initial	11	12	13
<mark>B0</mark>	BO	BO		
<mark>B1</mark>	Ν	B0,B1		•••
<mark>B2</mark>	N	B0,B1,B2		
<mark>B3</mark>	Ν	B0,B1,B2,B3	B0,B1,B3	
<mark>B4</mark>	N	B0,B1,B2,B3,B4	B0,B1,B3,B4	
<mark>B5</mark>	Ν	B0,B1,B5		
<mark>B6</mark>	N	B0,B1,B5,B6		
<mark>B7</mark>	Ν	B0,B1,B5,B6,B7	B0,B1,B5,B7	
<mark>B8</mark>	N	B0,B1,B5,B8		

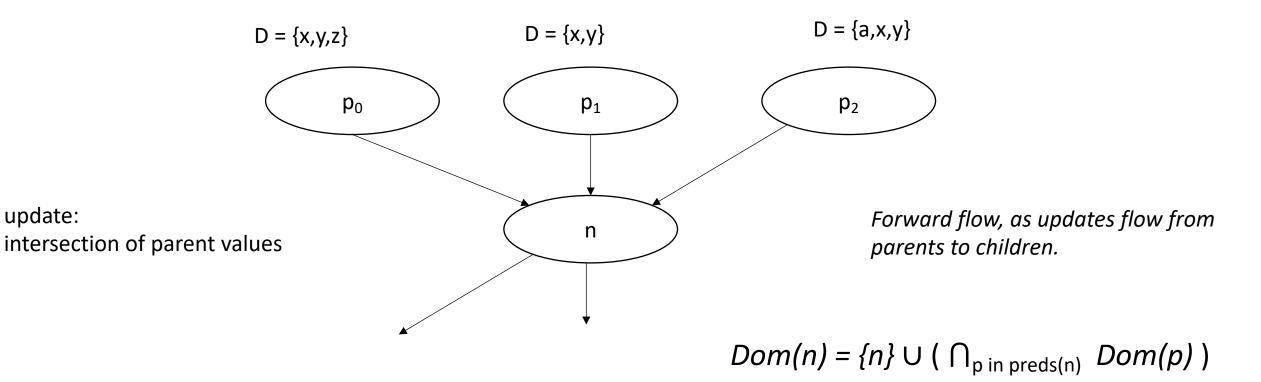


This can be any order...

How can we optimize the order?

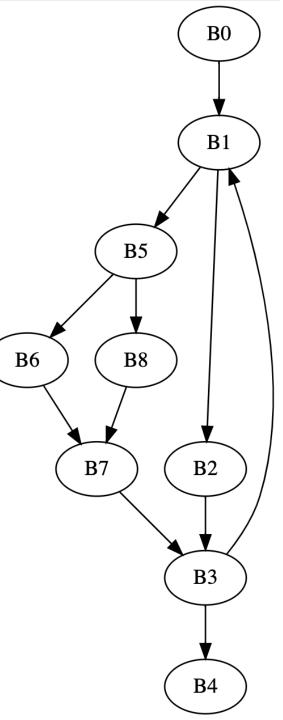
Given this intuition, what ordering would be best?

- Root node is initialized to itself
- Every node determines new dominators based on parent dominators



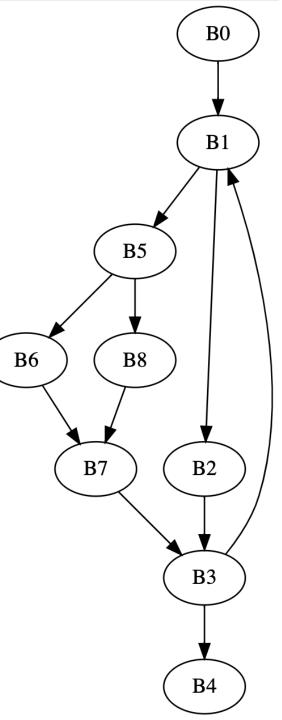
Node	New Order
BO	
B1	
B2	
B3	
B4	
B5	
B6	
B7	
B8	

Reverse post-order (rpo), where parents are visited first



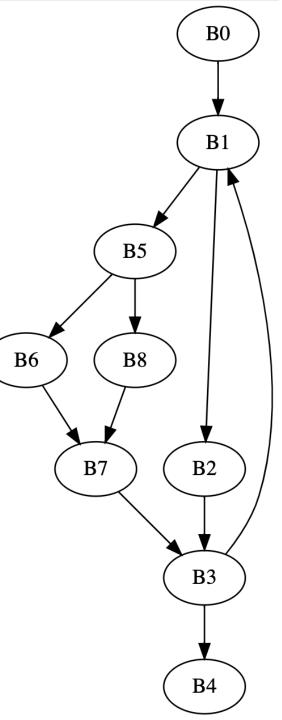
Node	New Order
BO	B0
B1	B1
B2	B2
B3	B5
B4	B6
B5	B8
B6	B7
B7	B3
B8	B4

Reverse post-order (rpo), where parents are visited first

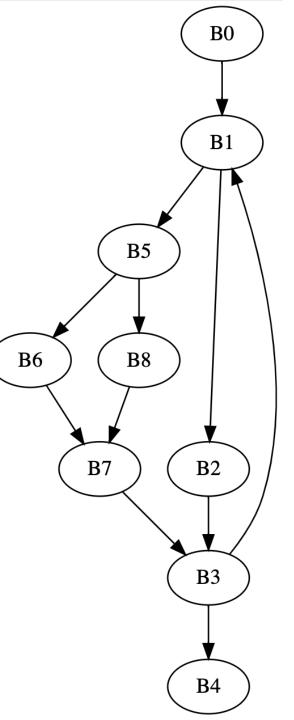


Node	New Order
BO	B0
B1	B1
B2	B2
<mark>B3</mark>	<mark>B5</mark>
B4	B6
B5	B8
B6	B7
B7	B3
B8	B4

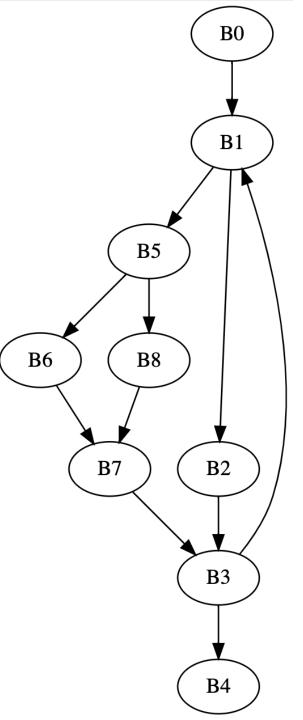
Reverse post-order (rpo), where parents are visited first



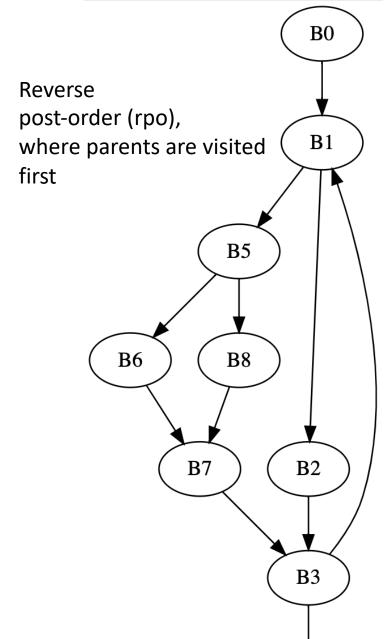
Node	Initial	11	
BO	BO		
B1	N		
B2	N		
B5	N		
B6	N		
B8	N		
B7	N		
B3	N		
B4	N		



Node	Initial	11	
BO	BO	BO	
B1	N	B0,B1	
B2	N	B0,B1,B2	
B5	N	B0,B1,B5	
B6	N	B0,B1,B5,B6	
B8	N	B0,B1,B5,B8	
B7	N	B0,B1,B5,B7	
B3	N	B0,B1,B3	
B4	N	B0,B1,B4	

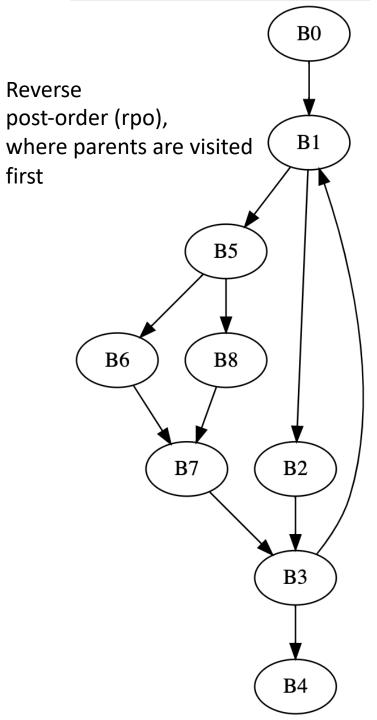


Node	Initial	11	12	
ВО	B0	BO		
B1	N	B0,B1		
B2	N	B0,B1,B2		
B5	N	B0,B1,B5		
B6	N	B0,B1,B5,B6		
B8	N	B0,B1,B5,B8		
B7	Ν	B0,B1,B5,B7		
B3	Ν	B0,B1,B3		
B4	Ν	B0,B1,B4		



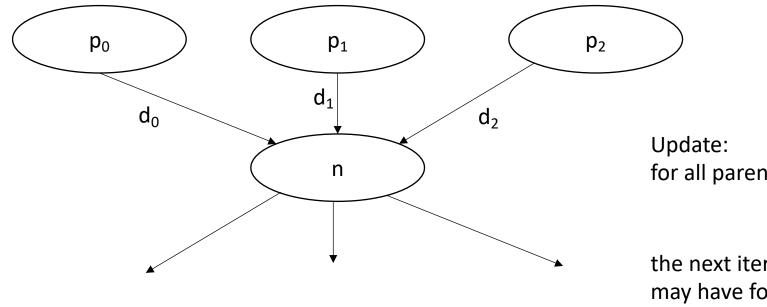
B4

Node	Initial	11	12	
ВО	B0	BO		
B1	N	B0,B1		
B2	N	B0,B1,B2		
B5	N	B0,B1,B5		
B6	N	B0,B1,B5,B6		
B8	N	B0,B1,B5,B8		
B7	Ν	B0,B1,B5,B7		
B3	N	B0,B1,B3		
B4	Ν	B0,B1,B4		



A quick aside about graph algorithms:

- Does node ordering matter in SSSP?
- Yes! Dijkstra's algorithm uses a priority queue
- Prioritize nodes with the lowest value



Traversal order in graph algorithms is a big research area!

Update: for all parents p: min(p + d)

the next iteration, another parent may have found a shorter path.

• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

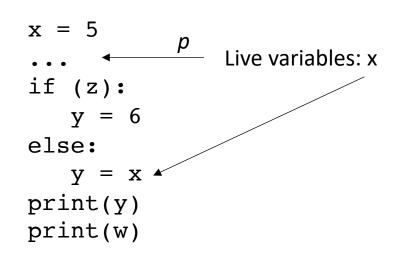
• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

• examples:

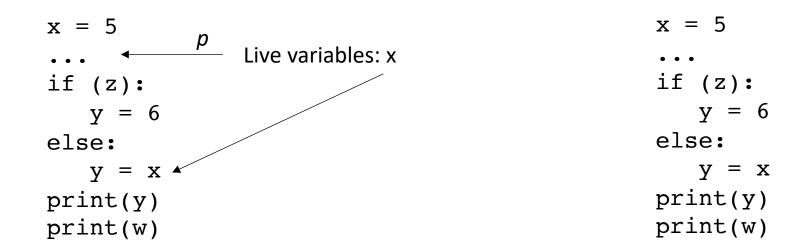
x = 5 ... if (z): y = 6 else: y = x print(y) print(w)

• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

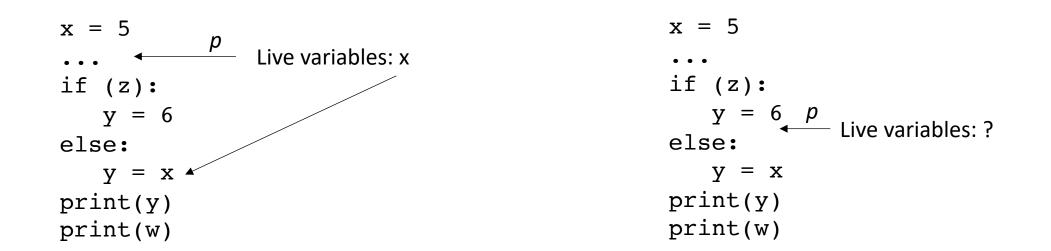
• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined



• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

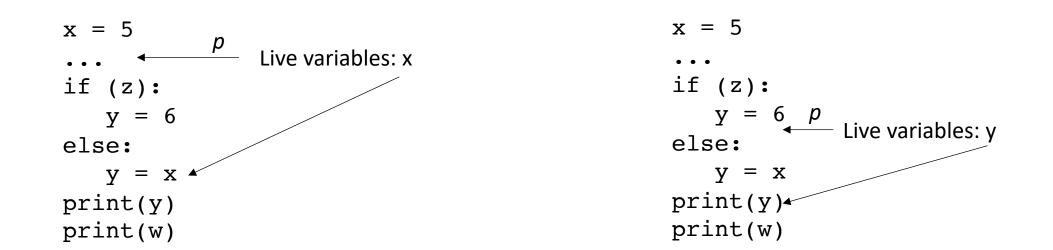


• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined



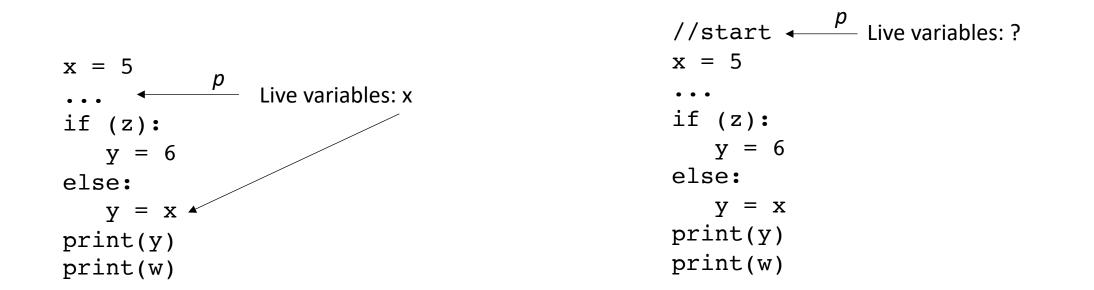
• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

• examples:



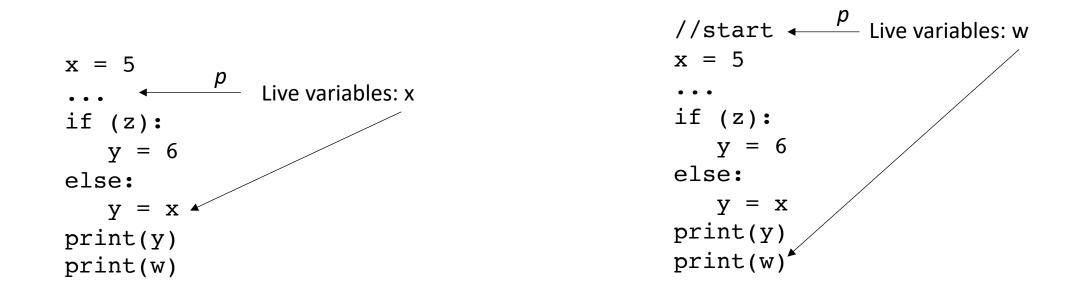
• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

• examples:



• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

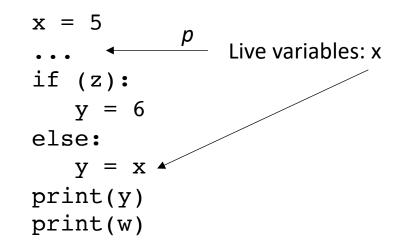
• examples:

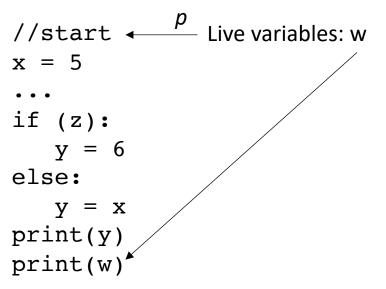


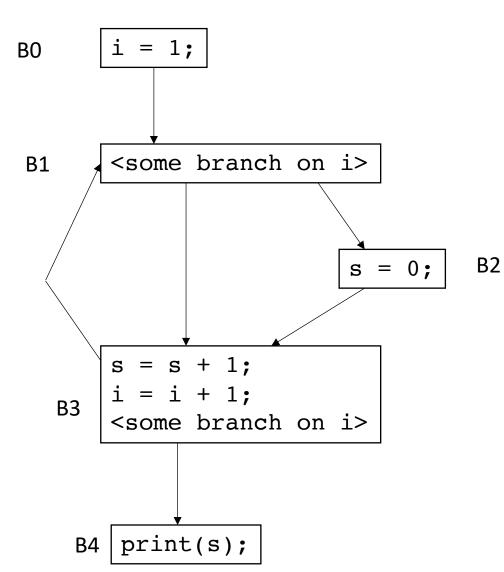
• A variable v is live at some point p in the program if there exists a path from p to some use of v where v has not been redefined

• examples:

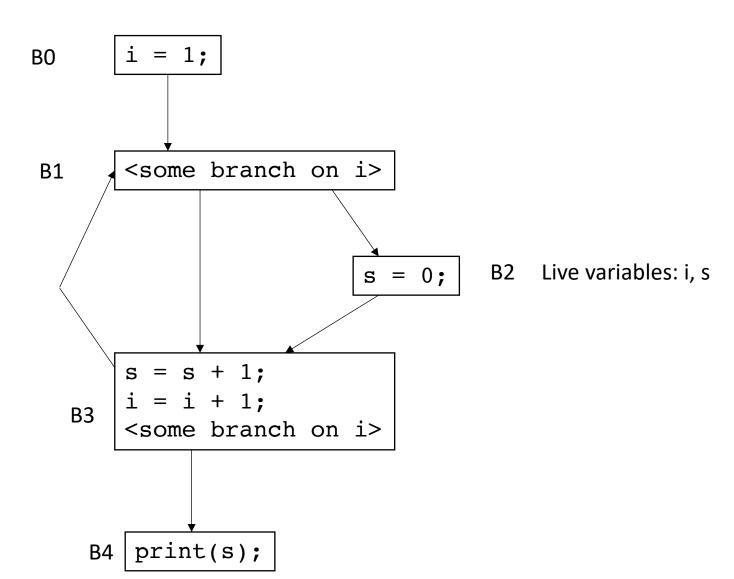
Accessing an uninitialized variable!

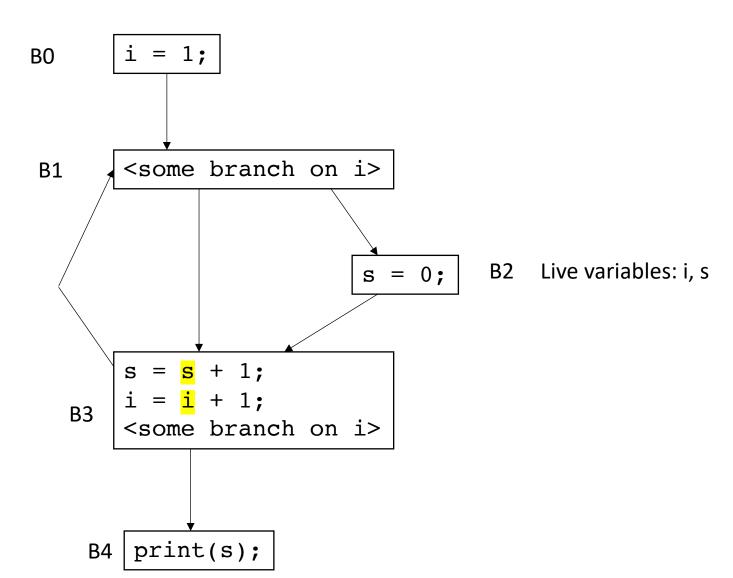


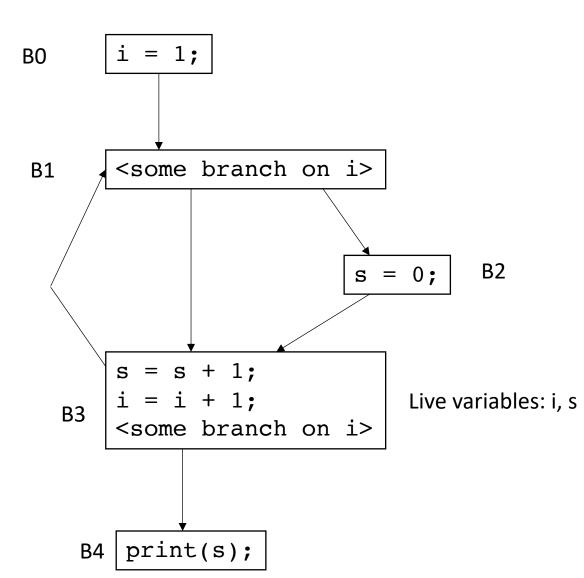


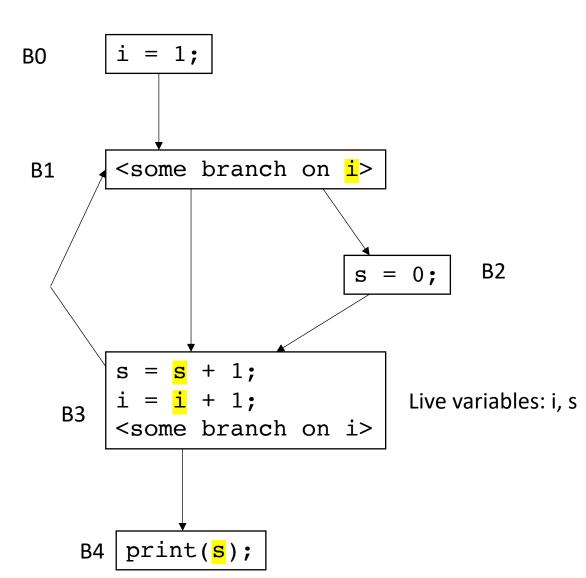


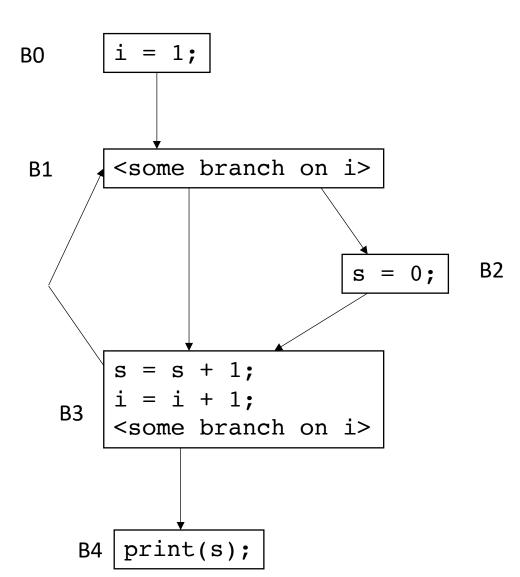
For each block B_x : we want to compute LiveOut: The set of variables that are live at the end of B_x









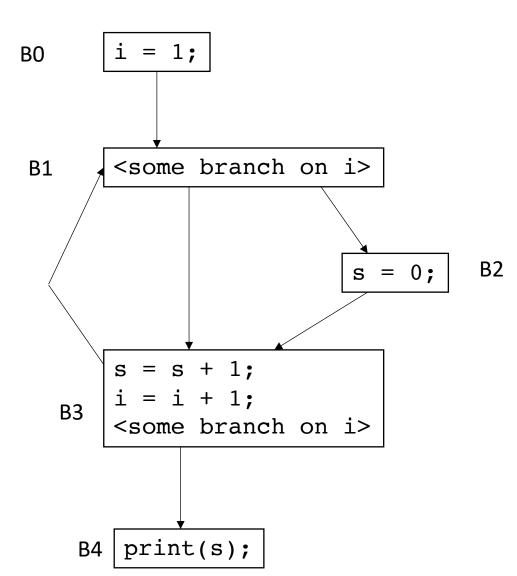


To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten

Block	VarKill	UEVar
ВО		
B1		
B2		
B3		
B4		

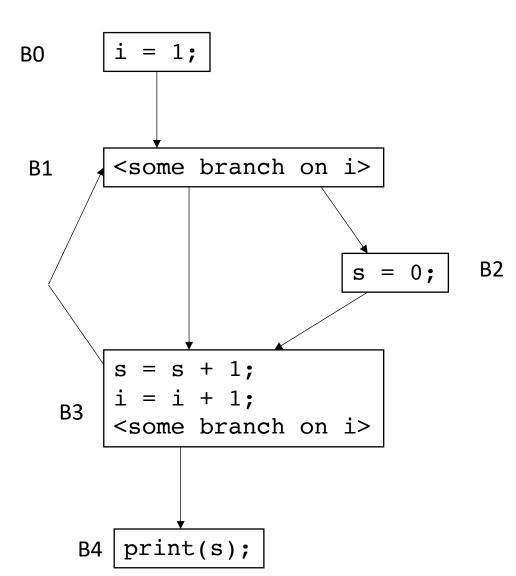


To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten

Block	VarKill	UEVar
BO	i	
B1	{}	
B2	S	
B3	s,i	
B4	{}	



To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten

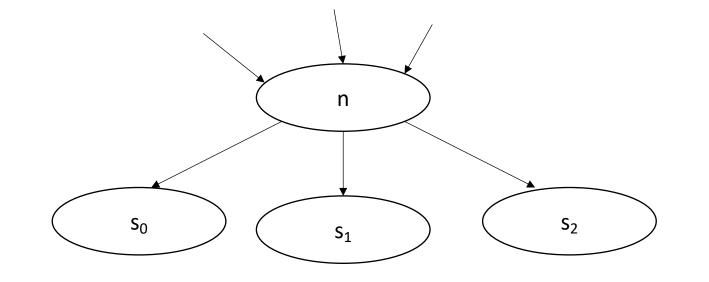
Block	VarKill	UEVar
B0	i	{}
B1	{}	i
B2	S	{}
B3	s,i	s,i
B4	{}	S

- Initial condition: LiveOut(n) = {} for all nodes
 - Ground truth, no variables are live at the exit of the program, i.e. end node n_{end} has LiveOut(n_{end})= {}

- Initial condition: LiveOut(n) = {} for all nodes
 - Ground truth, no variables are live at the exit of the program, i.e. end node n_{end} has LiveOut(n_{end})= {}

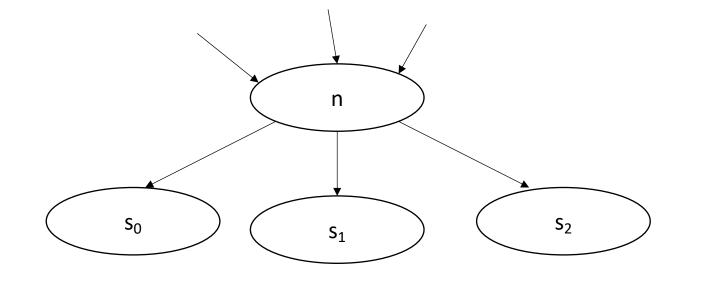
Now we can perform the iterative fixed point computation:

 $LiveOut(n) = \bigcup_{s \text{ in succ}(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$



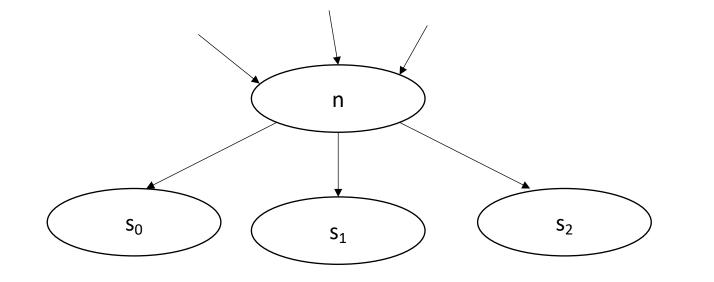
Backwards flow analysis because values flow from successors

 $LiveOut(n) = \bigcup_{s \text{ in } succ(n)} \left(\frac{UEVar(s)}{UEVar(s)} \cup (LiveOut(s) \cap VarKill(s)) \right)$



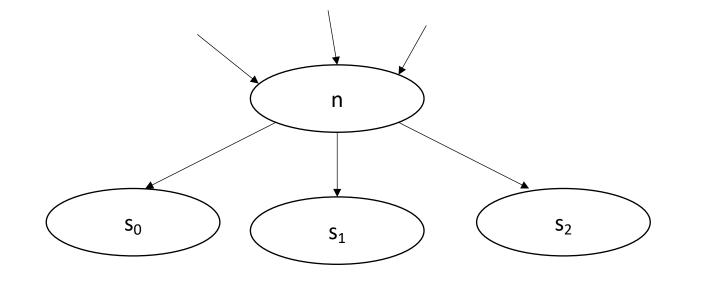
any variable in UEVar(s) is live at n

 $LiveOut(n) = \bigcup_{s \text{ in succ}(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$



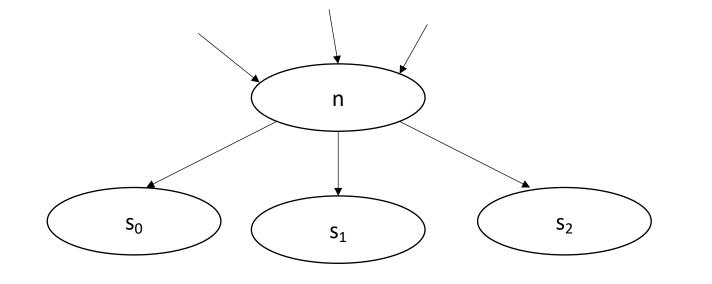
variables that are not overwritten in s

 $LiveOut(n) = \bigcup_{s \text{ in } succ(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$



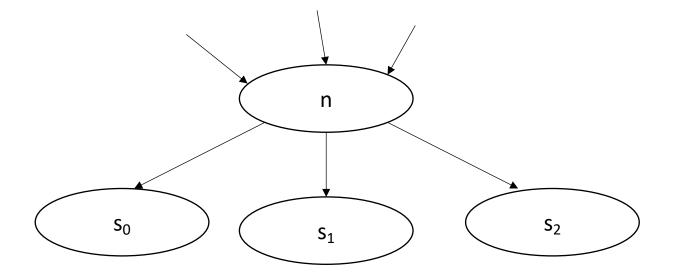
variables that are live at the end of s

 $LiveOut(n) = \bigcup_{s \text{ in } succ(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$



variables that are live at the end of s, and not overwritten by s

 $LiveOut(n) = \bigcup_{s \text{ in succ}(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$



LiveOut is a union rather than an intersection

$$Dom(n) = \{n\} \cup \left(\bigcap_{p \text{ in } preds(n)} Dom(p)\right)$$

Consider the language we use for each:

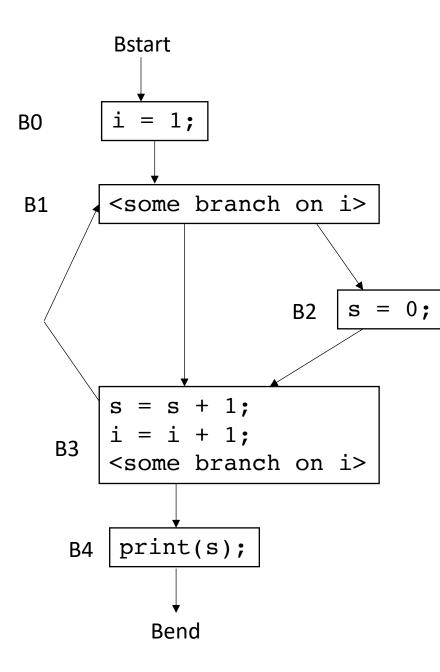
- **Dominance** of node b_x contains b_y if:
 - every path from the start to b_x goes through b_y
- LiveOut of node b_x contains variable y if:
 - some path from b_x contains a usage of y

 $LiveOut(n) = \bigcup_{s \text{ in succ(n)}} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$ $Dom(n) = \{n\} \cup (\bigcap_{p \text{ in preds(n)}} Dom(p))$

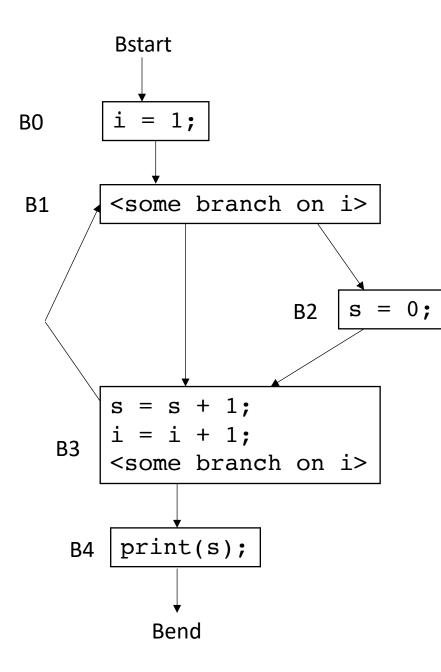
Consider the language we use for each:

- **Dominance** of node b_x contains b_y if:
 - every path from the start to b_x goes through b_y
- LiveOut of node b_x contains variable y if:
 - **some** path from b_x contains a usage of y
- Some vs. Every

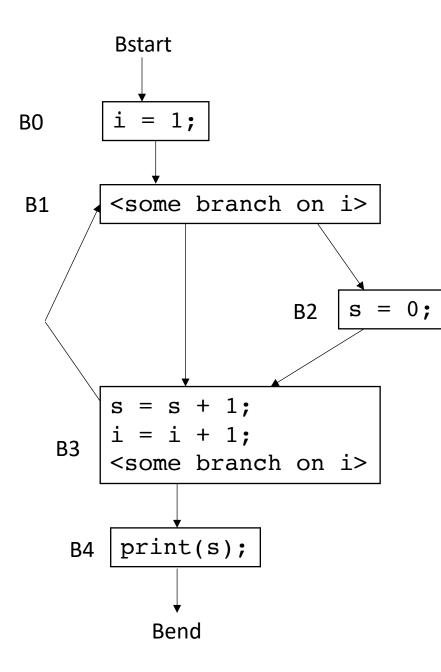
 $LiveOut(n) = \bigcup_{s \text{ in succ}(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$ $Dom(n) = \{n\} \cup (\bigcap_{p \text{ in preds}(n)} Dom(p))$



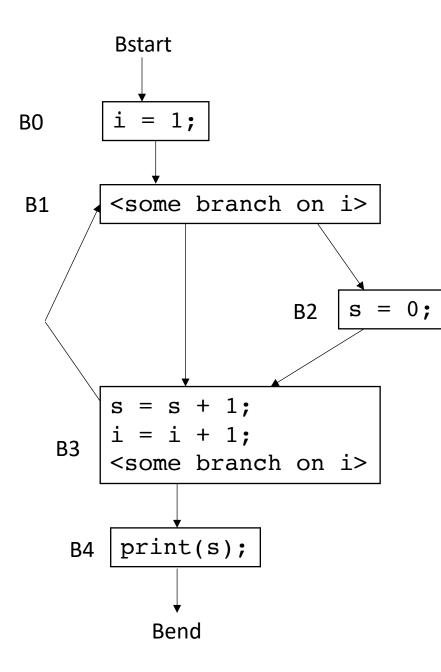
Block	VarKill	UEVar	LiveOut I ₀
Bstart	{}	{}	{}
BO	i	{}	{}
B1	{}	i	{}
B2	S	{}	{}
B3	s,i	s,i	{}
B4	{}	S	{}
Bend	{}	{}	{}



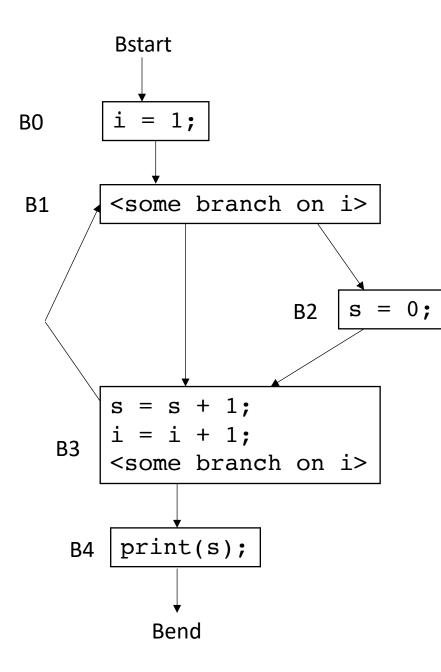
Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁
Bstart	{}	{}	{}	
B0	i	{}	{}	
B1	{}	i	{}	
B2	S	{}	{}	
B3	s,i	s,i	{}	
B4	{}	S	{}	
Bend	{}	{}	{}	



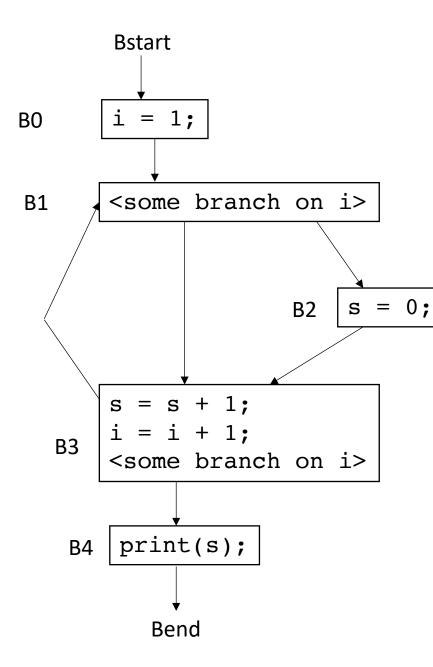
Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁
Bstart	{}	{}	{}	{}
BO	i	{}	{}	i
B1	{}	i	{}	s,i
B2	S	{}	{}	s,i
B3	s,i	s,i	{}	s,i
B4	{}	S	{}	{}
Bend	{}	{}	{}	{}



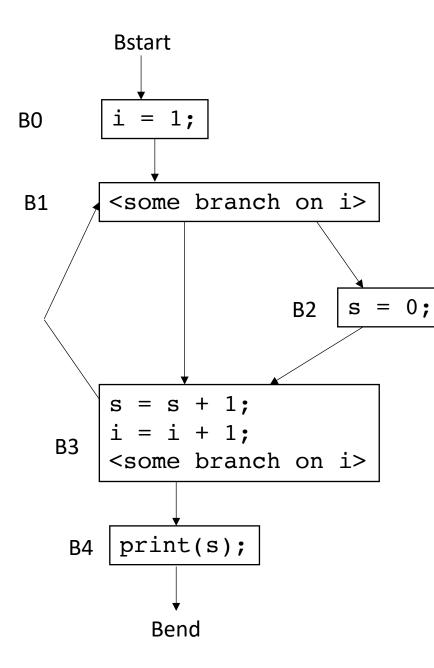
Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁	LiveOut I ₂
Bstart	{}	{}	{}	{}	
BO	i	{}	{}	i	
B1	{}	i	{}	s,i	
B2	S	{}	{}	s,i	
B3	s,i	s,i	{}	s,i	
B4	{}	S	{}	{}	
Bend	{}	{}	{}	{}	



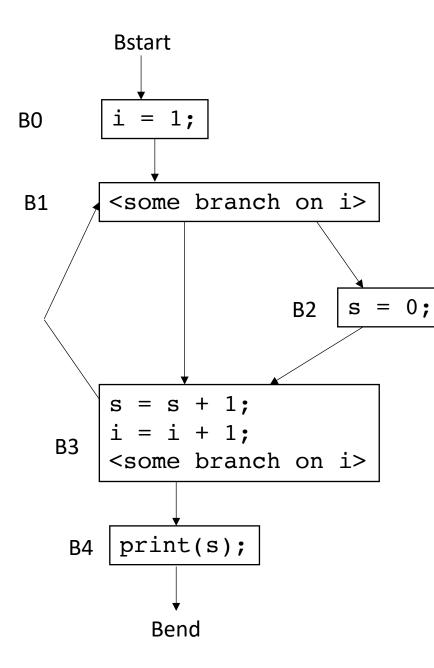
Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁	LiveOut I ₂
Bstart	{}	{}	{}	{}	{}
B0	i	{}	{}	i	s,i
B1	{}	i	{}	s,i	s,i
B2	S	{}	{}	s,i	s,i
B3	s,i	s,i	{}	s,i	s,i
B4	{}	S	{}	{}	{}
Bend	{}	{}	{}	{}	{}



	Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁	LiveOut I ₂	LiveOut I ₃
	Bstart	{}	{}	{}	{}	{}	
;	BO	i	{}	{}	i	s,i	
	B1	{}	i	{}	s,i	s,i	
	B2	S	{}	{}	s,i	s,i	
	B3	s,i	s,i	{}	s,i	s,i	
	B4	{}	S	{}	{}	{}	
	Bend	{}	{}	{}	{}	{}	



	Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁	LiveOut I ₂	LiveOut I ₃
_	Bstart	{}	{}	{}	{}	{}	S
;	B0	i	{}	{}	i	s,i	s,i
	B1	{}	i	{}	s,i	s,i	s,i
	B2	S	{}	{}	s,i	s,i	s,i
	B3	s,i	s,i	{}	s,i	s,i	s,i
	B4	{}	S	{}	{}	{}	{}
	Bend	{}	{}	{}	{}	{}	{}



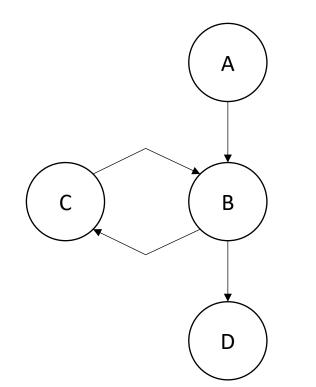
	Block	VarKill	UEVar	LiveOut I ₀	LiveOut I ₁	LiveOut I ₂	LiveOut I ₃
	Bstart	{}	{}	{}	{}	{}	S
;	BO	i	{}	{}	i	s,i	s,i
	B1	{}	i	{}	s,i	s,i	s,i
	B2	S	{}	{}	s,i	s,i	s,i
	B3	s,i	s,i	{}	s,i	s,i	s,i
	B4	{}	S	{}	{}	{}	{}
	Bend	{}	{}	{}	{}	{}	{}

Node ordering for backwards flow

- Reverse post-order was good for forward flow:
 - Parents are computed before their children
- For backwards flow: use reverse post-order of the reverse CFG
 - Reverse the CFG
 - perform a reverse post-order
- Different from post order?

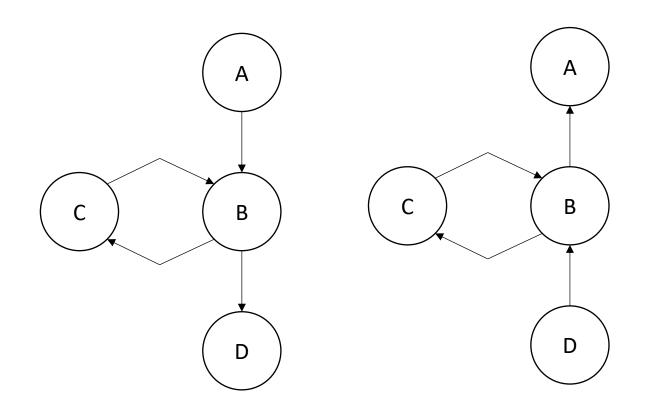
Example

post order: D, C, B, A



acks: thanks to this blog post for the example! https://eli.thegreenplace.net/2015/directed-graph-traversal-orderings-and-applications-to-data-flow-analysis/

Example



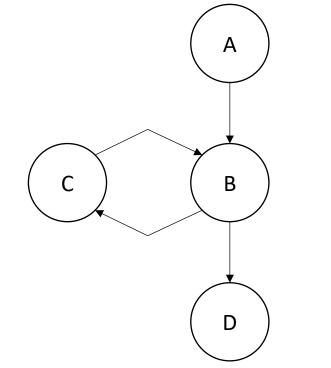
post order: D, C, B, A

rpo on reverse CFG: D, B, C, A

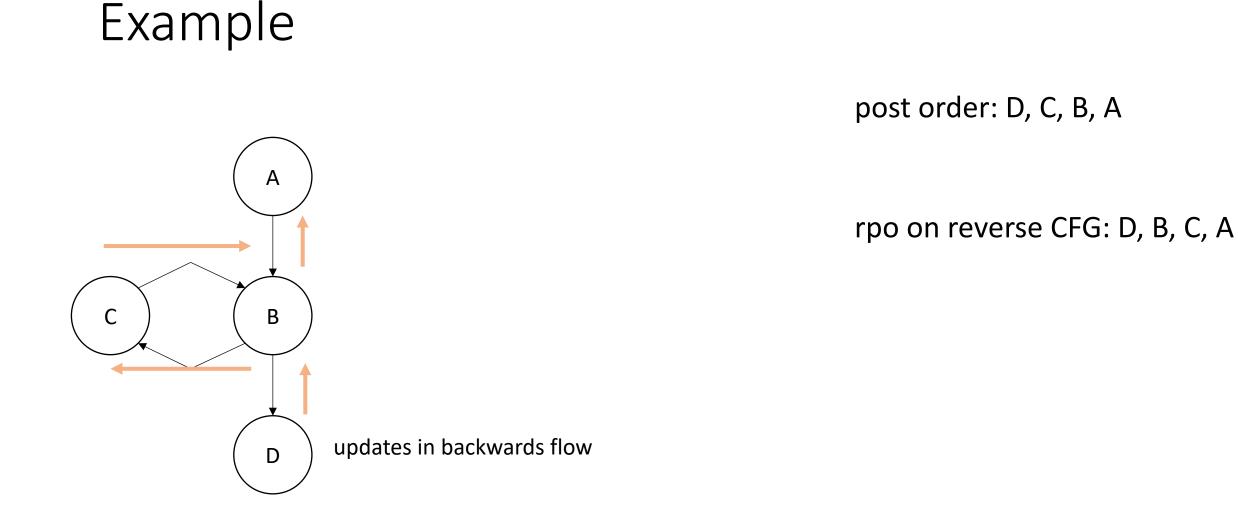


post order: D, C, B, A

rpo on reverse CFG: D, B, C, A



rpo on reverse CFG computes B before C, thus, C can see updated information from B



rpo on reverse CFG computes B before C, thus, C can see updated information from B

Live variable limitations

To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten.

Consider:

s = a[x] + 1;

To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten.

Consider:

s = a[x] + 1;

UEVar needs to assume a[x] is any memory location that it cannot prove non-aliasing

To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten.

Consider:

a[x] = s + 1;

To compute the LiveOut sets, we need two initial sets:

VarKill for block b is any variable in block b that gets overwritten

UEVar (upward exposed variable) for block b is any variable in b that is read before being overwritten.

Consider:

a[x] = s + 1;

VarKill also needs to know about aliasing

Sound vs. Complete

- Sound: Any property the analysis says is true, is true. However, there may be false positives
- Complete: Any error the analysis reports is actually an error. The analysis cannot prove a property though.

 $LiveOut(n) = \bigcup_{s \text{ in succ}(n)} (UEVar(s) \cup (LiveOut(s) \cap VarKill(s)))$

How to instantiate the UEVar and VarKill for sound/complete analysis w.r.t. memory?

$$a[x] = s + 1;$$

$$s = a[x] + 1;$$

Imprecision can come from CFG construction:

consider:

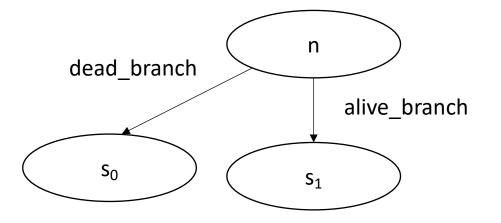
br 1 < 0, dead_branch, alive_branch</pre>

Imprecision can come from CFG construction:

consider:

br 1 < 0, dead_branch, alive_branch</pre>

could come from arguments, etc.



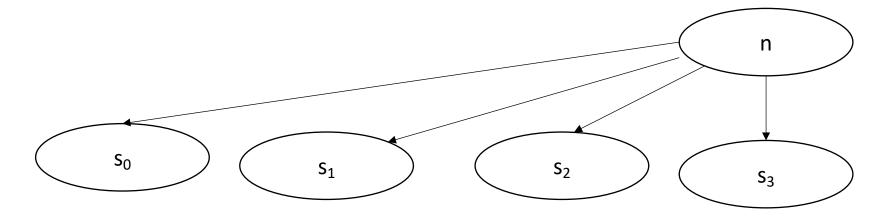
Imprecision can come from CFG construction:

consider first class labels (or functions):

br label_reg

where label_reg is a register that contains a register

need to branch to all possible basic blocks!



The Data Flow Framework

$$f(x) = Op_{v in (succ | preds)} c_0 op_1 (f(n) op_2 c_2)$$

AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$

An expression e is "available" at a basic block b_x if for all paths to b_x , e is evaluated and none of its arguments are overwritten

AvailExpr(n)= ∩_{p in preds} DEExpr(p) ∪ (AvailExpr(p) ∩ ExprKill(p))

Forward Flow

AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$

intersection implies "must" analysis

AvailExpr(n)= $\bigcap_{p \text{ in preds}} \frac{\text{DEExpr(p)}}{\text{DEExpr(p)}} \cup (\text{AvailExpr(p)} \cap \text{ExprKill(p)})$

DEExpr(p) is all Downward Exposed Expressions in p. That is expressions that are evaluated AND operands are not redefined

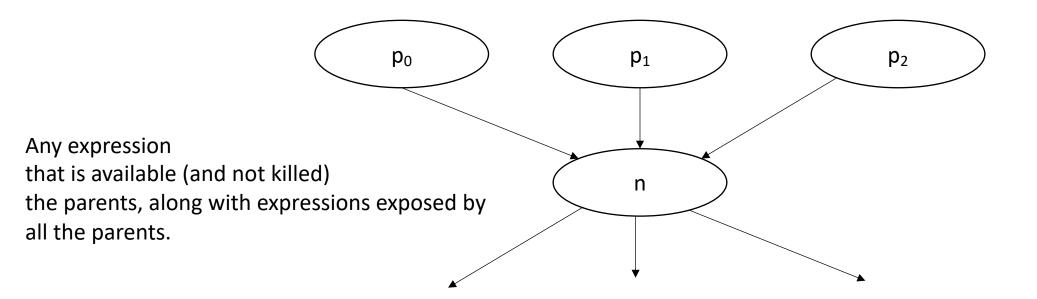
AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$

AvailExpr(p) is any expression that is available at p

AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$

ExprKill(p) is any expression that p killed, i.e. if one or more of its operands is redefined in p

AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$



AvailExpr(n)= $\bigcap_{p \text{ in preds}} DEExpr(p) \cup (AvailExpr(p) \cap ExprKill(p))$

Application: you can add availExpr(n) to local optimizations in n, e.g. local value numbering

AntOut(n)= $\bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$

An expression e is "anticipable" at a basic block b_x if for all paths that leave b_x , e is evaluated

$AntOut(n) = \bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$

Backwards flow

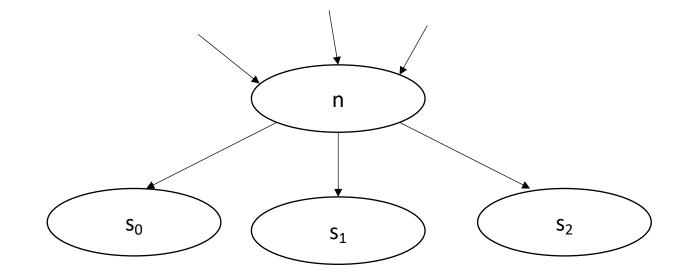
AntOut(n)= $\bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$

"must" analysis

AntOut(n)= $\bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$

UEExpr(p) is all Upward Exposed Expressions in p. That is expressions that are computed in p before operands are overwritten.

AntOut(n)= $\bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$



AntOut(n)= $\bigcap_{s \text{ in succ}} UEExpr(s) \cup (AntOut(s) \cap ExprKill(s))$

Application: you can hoist AntOut expressions to compute as early as possible

Reaching Definitions

- Read about this in 9.2.4
- trace variable usages in block b to possible definitions
- can be used in alias analysis

Next Lecture

• SSA form and homework