# CS738: Advanced Compiler Optimizations Data Flow Analysis

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Static analysis and compile-time optimizations

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- For the next few lectures

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  - Components

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- Unless otherwise specified

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Assignments x = y op z

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Jump/control transfer

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Jump/control transfer goto L

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Arrays, Pointers and Functions to be added later when needed

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  - Typically we use "maximal" basic block (maximal sequence of such instructions)

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  - Instruction immediately following a branch

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- ► E = set of edges

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  - Single procedure, single flow graph for now.

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    - Program point after a stmt is same as the program point before the next stmt

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  - For  $B_1$  and  $B_2$ :
    - if there is an edge from  $B_1$  to  $B_2$  in CFG, then the program point *after* the last stmt of  $B_1$  may be followed immediately by the program point before the first stmt of  $B_2$ .

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- Infinite number of possible execution paths in practical programs.
- Paths having no finite upper bound on the length.
- Need to summarize the information at a program point with a finite set of facts.

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Constraints on data flow values

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  - Why not exact solution?

Transfer functions

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 $ightharpoonup f_s$  depends on the statement and the analysis



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$$\mathsf{IN}[s_{i+1}] = \mathsf{OUT}[s_i], i = 1, 2, \dots, n-1$$

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▶  $IN[s_1]$ ,  $OUT[s_n]$  to come later

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- ▶  $f \circ g$ : Composition of functions f and g
- →: An abstract operator denoting some way of combining facts present in a set .

Forward

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  - For *B* consisting of  $s_1, s_2, \ldots, s_n$

$$f_B = f_{s_n} \circ \ldots \circ f_{s_2} \circ f_{s_1}$$

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Control flow constraints

$$\mathsf{IN}[B] = \bigoplus_{P \in \mathsf{PRED}(B)} \mathsf{OUT}[P]$$

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Backward

$$f_B = f_{S_1} \circ f_{S_2} \circ \ldots \circ f_{S_n}$$
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 $\mathsf{OUT}[B] = \bigoplus_{S \in \mathsf{SUCC}(B)} \mathsf{IN}[S]$ 

▶ Typical Equation

$$\mathsf{OUT}[s] = \mathsf{IN}[s] - \mathit{kill}[s] \cup \mathit{gen}[s]$$

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Example:

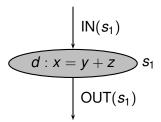
```
a = b*c // generates expression b * c
c = 5 // kills expression b*c
d = b*c // is b*c redundant here?
```

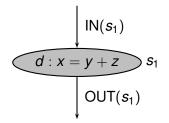
# **Example Data Flow Analysis**

- Reaching Definitions Analysis
- ▶ Definition of a variable x:  $x = \dots$  something  $\dots$
- Could be more complex (e.g. through pointers, references, implicit)

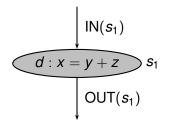
# Reaching Definitions Analysis

- A definition d reaches a point p if
  - there is a path from the point immediately following d to p
  - d is not "killed" along that path
  - "Kill" means redefinition of the left hand side (x in the earlier example)

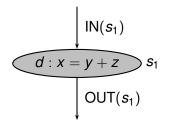




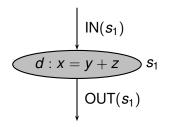
$$\mathsf{OUT}(s_1) = \mathsf{IN}(s_1) - \mathsf{KILL}(s_1) \cup \mathsf{GEN}(s_1)$$



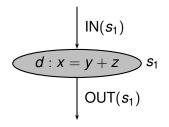
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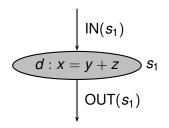
$$OUT(s_1) = IN(s_1) - KILL(s_1) \cup GEN(s_1)$$
$$GEN(s_1) = \{d\}$$



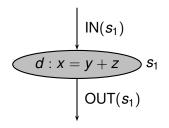
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```



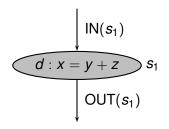
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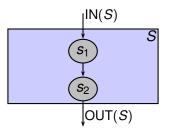


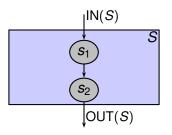
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KILL(s_1) = D_x?
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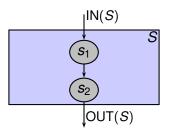
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\mathsf{KILL}(s_1) = D_x? will also work here

but may not work in general
```

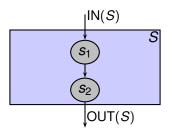




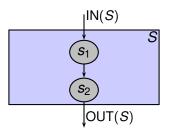
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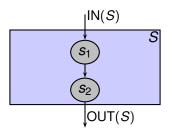


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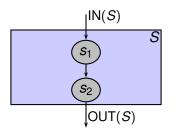


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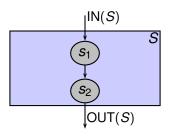
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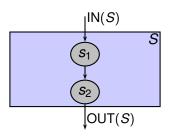
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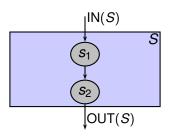
$$\begin{array}{lcl} \mathsf{GEN}(S) & = & \mathsf{GEN}(s_1) - \mathsf{KILL}(s_2) \cup \mathsf{GEN}(s_2) \\ \mathsf{KILL}(S) & = & \mathsf{KILL}(s_1) - \mathsf{GEN}(s_2) \cup \mathsf{KILL}(s_2) \\ \mathsf{IN}(s_1) & = & \mathsf{IN}(S) \end{array}$$



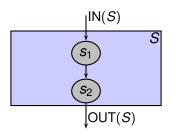
$$\begin{aligned} \mathsf{GEN}(S) &=& \mathsf{GEN}(s_1) - \mathsf{KILL}(s_2) \cup \mathsf{GEN}(s_2) \\ \mathsf{KILL}(S) &=& \mathsf{KILL}(s_1) - \mathsf{GEN}(s_2) \cup \mathsf{KILL}(s_2) \\ \mathsf{IN}(s_1) &=& \mathsf{IN}(S) \\ \mathsf{IN}(s_2) &=& \end{aligned}$$



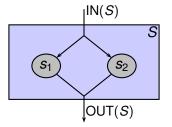
$$\begin{aligned} \mathsf{GEN}(S) &=& \mathsf{GEN}(s_1) - \mathsf{KILL}(s_2) \cup \mathsf{GEN}(s_2) \\ \mathsf{KILL}(S) &=& \mathsf{KILL}(s_1) - \mathsf{GEN}(s_2) \cup \mathsf{KILL}(s_2) \\ \mathsf{IN}(s_1) &=& \mathsf{IN}(S) \\ \mathsf{IN}(s_2) &=& \mathsf{OUT}(s_1) \end{aligned}$$

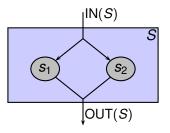


$$\begin{aligned} \mathsf{GEN}(S) &=& \mathsf{GEN}(s_1) - \mathsf{KILL}(s_2) \cup \mathsf{GEN}(s_2) \\ \mathsf{KILL}(S) &=& \mathsf{KILL}(s_1) - \mathsf{GEN}(s_2) \cup \mathsf{KILL}(s_2) \\ \mathsf{IN}(s_1) &=& \mathsf{IN}(S) \\ \mathsf{IN}(s_2) &=& \mathsf{OUT}(s_1) \\ \mathsf{OUT}(S) &=& \end{aligned}$$

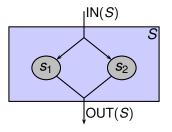


```
\begin{aligned} \mathsf{GEN}(S) &=& \mathsf{GEN}(s_1) - \mathsf{KILL}(s_2) \cup \mathsf{GEN}(s_2) \\ \mathsf{KILL}(S) &=& \mathsf{KILL}(s_1) - \mathsf{GEN}(s_2) \cup \mathsf{KILL}(s_2) \\ \mathsf{IN}(s_1) &=& \mathsf{IN}(S) \\ \mathsf{IN}(s_2) &=& \mathsf{OUT}(s_1) \\ \mathsf{OUT}(S) &=& \mathsf{OUT}(s_2) \end{aligned}
```

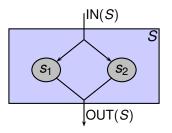




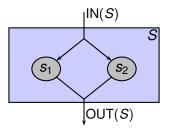
$$GEN(S) =$$



$$\mathsf{GEN}(S) = \mathsf{GEN}(s_1) \cup \mathsf{GEN}(s_2)$$

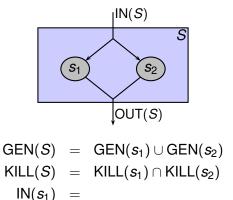


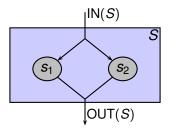
$$GEN(S) = GEN(s_1) \cup GEN(s_2)$$
  
 $KILL(S) =$ 



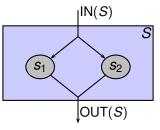
$$\mathsf{GEN}(S) = \mathsf{GEN}(s_1) \cup \mathsf{GEN}(s_2)$$

$$\mathsf{KILL}(S) = \mathsf{KILL}(s_1) \cap \mathsf{KILL}(s_2)$$

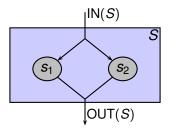




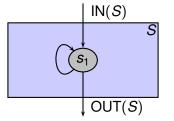
$$GEN(S) = GEN(s_1) \cup GEN(s_2)$$
  
 $KILL(S) = KILL(s_1) \cap KILL(s_2)$   
 $IN(s_1) = IN(s_2) = IN(S)$ 

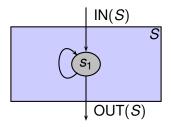


$$\mathsf{GEN}(S) = \mathsf{GEN}(s_1) \cup \mathsf{GEN}(s_2)$$
 $\mathsf{KILL}(S) = \mathsf{KILL}(s_1) \cap \mathsf{KILL}(s_2)$ 
 $\mathsf{IN}(s_1) = \mathsf{IN}(s_2) = \mathsf{IN}(S)$ 
 $\mathsf{OUT}(S) =$ 

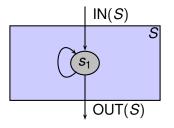


$$GEN(S) = GEN(s_1) \cup GEN(s_2)$$
  
 $KILL(S) = KILL(s_1) \cap KILL(s_2)$   
 $IN(s_1) = IN(s_2) = IN(S)$   
 $OUT(S) = OUT(s_1) \cup OUT(s_2)$ 

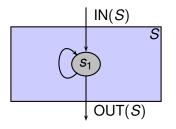




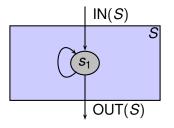
$$GEN(S) =$$



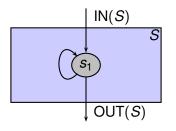
$$GEN(S) = GEN(s_1)$$



$$GEN(S) = GEN(s_1)$$
  
 $KILL(S) =$ 



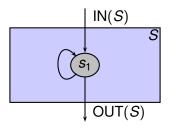
$$GEN(S) = GEN(s_1)$$
  
 $KILL(S) = KILL(s_1)$ 



```
GEN(S) = GEN(s_1)

KILL(S) = KILL(s_1)

OUT(S) =
```

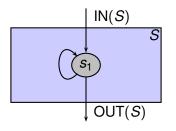


```
GEN(S) = GEN(s_1)

KILL(S) = KILL(s_1)

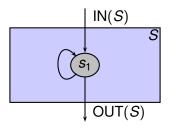
OUT(S) = OUT(s_1)
```

# RD Analysis of a Structured Program

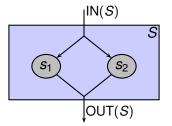


```
GEN(S) = GEN(s_1)
KILL(S) = KILL(s_1)
OUT(S) = OUT(s_1)
IN(s_1) =
```

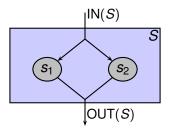
# RD Analysis of a Structured Program



```
\begin{aligned} \mathsf{GEN}(S) &=& \mathsf{GEN}(s_1) \\ \mathsf{KILL}(S) &=& \mathsf{KILL}(s_1) \\ \mathsf{OUT}(S) &=& \mathsf{OUT}(s_1) \\ \mathsf{IN}(s_1) &=& \mathsf{IN}(S) \cup \mathsf{GEN}(s_1) \end{aligned}
```

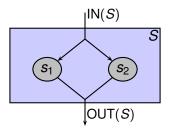


Assumption: All paths are feasible.



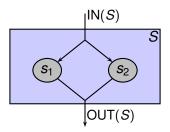
- Assumption: All paths are feasible.
- Example:

```
if (true) s1;
else s2;
```



- Assumption: All paths are feasible.
- Example:

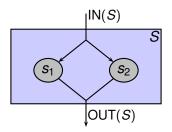
```
if (true) s1;
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```



- Assumption: All paths are feasible.
- Example:

```
if (true) s1;
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```

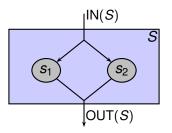
```
Fact Computed Actual GEN(S) = GEN(s_1) \cup GEN(s_2) \supseteq GEN(s_1)
```

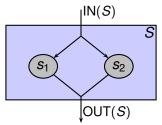


- Assumption: All paths are feasible.
- Example:

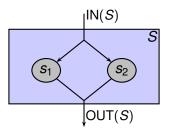
```
if (true) s1;
else s2;
```

Fact		Computed		Actual
GEN(S)	=	$GEN(s_1) \cup GEN(s_2)$	$\supseteq$	$GEN(s_1)$
KILL(S)	=	$KILL(s_1) \cap KILL(s_2)$	$\subseteq$	$KILL(s_1)$



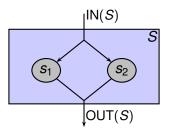


► Thus, true  $GEN(S) \subseteq analysis GEN(S)$ 



### ► Thus,

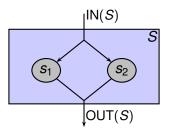
true  $GEN(S) \subseteq$  analysis GEN(S) true  $KILL(S) \supseteq$  analysis KILL(S)



► Thus,

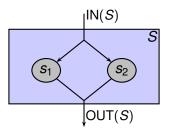
```
true GEN(S) \subseteq analysis GEN(S) true KILL(S) \supseteq analysis KILL(S)
```

More definitions computed to be reaching than actually do!



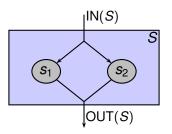
```
true GEN(S) \subseteq analysis GEN(S) true KILL(S) \supseteq analysis KILL(S)
```

- More definitions computed to be reaching than actually do!
- ► Later we shall see that this is SAFE approximation



```
true GEN(S) \subseteq analysis GEN(S) true KILL(S) \supseteq analysis KILL(S)
```

- More definitions computed to be reaching than actually do!
- Later we shall see that this is SAFE approximation
  - prevents optimizations



```
true GEN(S) \subseteq analysis GEN(S) true KILL(S) \supseteq analysis KILL(S)
```

- More definitions computed to be reaching than actually do!
- Later we shall see that this is SAFE approximation
  - prevents optimizations
  - but NO wrong optimization

► A definition *d* can reach the start of a block from any of its predecessor

$$\mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P)$$

- ▶ A definition d can reach the start of a block from any of its predecessor
  - if it reaches the end of some predecessor

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$$\mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P)$$

A definition d reaches the end of a block if

$$\mathsf{OUT}(B) = \mathsf{IN}(B) - \mathsf{KILL}(B) \cup \mathsf{GEN}(B)$$

- ▶ A definition d can reach the start of a block from any of its predecessor
  - if it reaches the end of some predecessor

$$\mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P)$$

- A definition d reaches the end of a block if
  - either it is generated in the block

$$\mathsf{OUT}(B) = \mathsf{IN}(B) - \mathsf{KILL}(B) \cup \mathsf{GEN}(B)$$

- ▶ A definition d can reach the start of a block from any of its predecessor
  - if it reaches the end of some predecessor

$$\mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P)$$

- A definition d reaches the end of a block if
  - either it is generated in the block
  - or it reaches block and not killed

$$\mathsf{OUT}(B) = \mathsf{IN}(B) - \mathsf{KILL}(B) \cup \mathsf{GEN}(B)$$

KILL & GEN known for each BB.

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- ► A program with *N* BBs has 2*N* equations with 2*N* unknowns.

- KILL & GEN known for each BB.
- A program with N BBs has 2N equations with 2N unknowns.
  - Solution is possible.

- KILL & GEN known for each BB.
- A program with N BBs has 2N equations with 2N unknowns.
  - Solution is possible.
  - Iterative approach (on the next slide).

for each block  $\boldsymbol{B}$  {

for each block B {  $OUT(B) = \emptyset$ ;

```
for each block B {  {\rm OUT}(B) = \emptyset; }  }  {\rm OUT}(Entry) = \emptyset; \ // \ {\rm note \ this \ for \ later \ discussion}
```

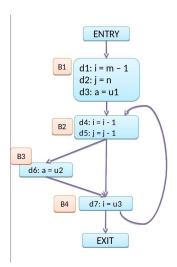
```
for each block B { OUT(B) = \emptyset; } OUT(Entry) = \emptyset; // note this for later discussion change = true; while (change) { change = false;
```

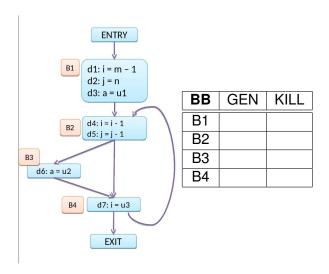
```
for each block B { OUT(B) = \emptyset; } OUT(Entry) = \emptyset; // note this for later discussion change = true; while (change) { change = false; for each block B other than Entry {
```

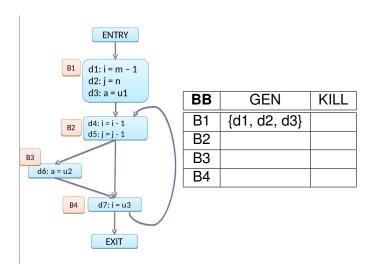
```
for each block B { OUT(B) = \emptyset; } OUT(Entry) = \emptyset; // note this for later discussion change = true; while (change) { change = false; for each block B other than Entry { IN(B) = \bigcup_{P \in PRED(B)} OUT(P);
```

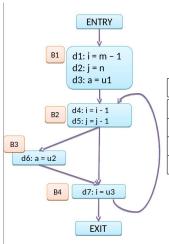
```
for each block B { OUT(B) = \emptyset; } OUT(Entry) = \emptyset; // note this for later discussion change = true; while (change) { change = false; for each block B other than Entry { IN(B) = \bigcup_{P \in PRED(B)} OUT(P); oldOut = OUT(B); OUT(B) = IN(B) - KILL(B) \cup GEN(B);
```

```
for each block B {
     OUT(B) = \emptyset;
OUT(Entry) = \emptyset; // note this for later discussion
change = true;
while (change) {
     change = false;
     for each block B other than Entry {
          \mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P);
          oldOut = OUT(B);
          OUT(B) = IN(B) - KILL(B) \cup GEN(B);
          if (OUT(B) \neq oldOut) then {
                change = true;
```

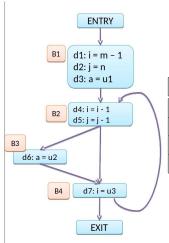




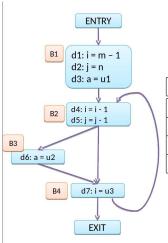




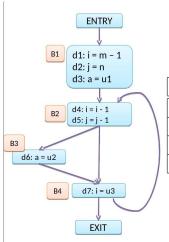
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2		
В3		
B4		



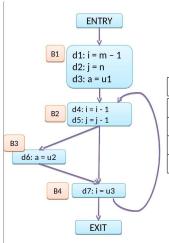
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	
В3		
B4		



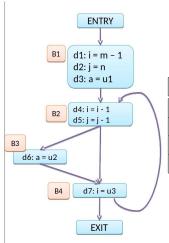
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	{d1, d2, d7}
В3		
B4		



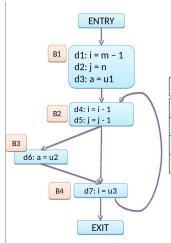
ВВ	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	{d1, d2, d7}
В3	{d6}	
B4		



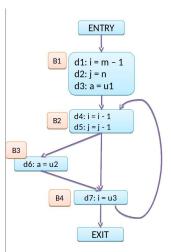
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	{d1, d2, d7}
В3	{d6}	{d3}
B4		



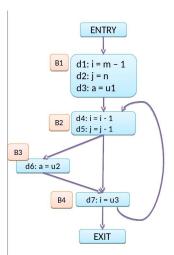
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	{d1, d2, d7}
В3	{d6}	{d3}
B4	{d7}	



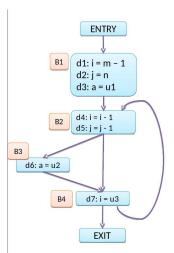
BB	GEN	KILL
B1	{d1, d2, d3}	{d4, d5, d6, d7}
B2	{d4, d5}	{d1, d2, d7}
В3	{d6}	{d3}
B4	{d7}	{d1, d4}



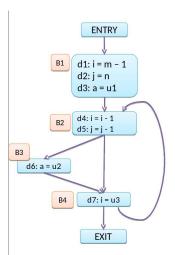
Pass#	Pt	B1	B2	B3	B4
Init	IN	-	-	-	-
	OUT	Ø	Ø	Ø	Ø



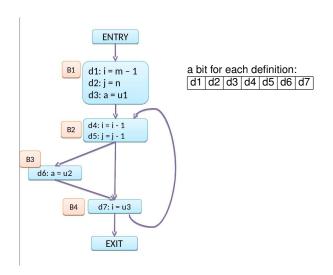
Pass#	Pt	B1	B2	B3	B4
Init	IN	-	-	-	-
	OUT	Ø	Ø	Ø	Ø
1	IN	Ø	d1, d2,	d3, d4, d5	d3,
			d3	d4, d5	d4,
					d5, d6
	OUT	d1, d2, d3	d3, d4, d5	d4, d5, d6	d3,
		d2, d3	d5	d5, d6	d5, d6, d7
					d6. d7

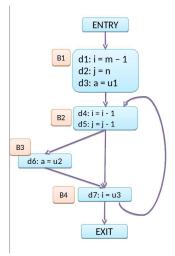


Pass#	Pt	B1	B2	B3	B4
Init	IN	-	-	-	-
	OUT	Ø	Ø	Ø	Ø
1	IN	Ø	d1, d2,	d3,	d3,
			d3	d4, d5	d4,
					d5, d6
	OUT	d1,	d3, d4,	d4,	d3,
		d2, d3	d5	d5, d6	d5,
					d6, d7
2	IN	Ø	d1, d2,	d3,	d3,
			d3, d5,	d4,	d4,
			d6, d7	d5, d6	d5, d6
	OUT	d1,	d3, d4,	d4,	d3,
		d2, d3	d5, d6	d5, d6	d5,
					d6, d7



Pass#	Pt	B1	B2	B3	B4
Init	IN	-	-	-	-
	OUT	Ø	Ø	Ø	Ø
1	IN	Ø	d1, d2,	d3,	d3,
			d3	d4, d5	d4,
					d5, d6
	OUT	d1,	d3, d4,	d4,	d3,
		d2, d3	d5	d5, d6	d5,
					d6, d7
2	IN	Ø	d1, d2,	d3,	d3,
			d3, d5,	d4,	d4,
			d6, d7	d5, d6	d5, d6
	OUT	d1,	d3, d4,	d4,	d3,
		d2, d3	d5, d6	d5, d6	d5,
					d6, d7
3	IN	Ø	d1, d2,	d3,	d3,
			d3, d5,	d4,	d4,
			d6, d7	d5, d6	d5, d6
	OUT	d1,	d3, d4,	d4,	d3,
		d2, d3	d5, d6	d5, d6	d5,
					d6, d7





a bit for each definition: d1 d2 d3 d4 d5 d6 d7

Pass#	Pt	B1	B2	В3	B4
Init	IN	-	-	-	
	OUT	0000000	0000000	0000000	0000000
1	IN	0000000	1110000	0011100	0011110
	OUT	1110000	0011100	0001110	0010111
2	IN		1110111		
	OUT	1110000	0011110	0001110	0010111
3	IN		1110111		
	OUT	1110000	0011110	0001110	0010111

Set-theoretic definitions:

$$\mathsf{IN}(B) = \bigcup_{P \in \mathsf{PRED}(B)} \mathsf{OUT}(P)$$
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**▶** Bitwise ∨, ∧, ¬ operators



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while changes occur {
  forall the stmts S of the program {
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      if all operands of S are constant {
        replace rhs by eval(rhs);
    }
}
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     foreach operand B of S {
        if there is a unique definition of B
        that reaches S and is a constant C {
        replace B by C in S;
        if all operands of S are constant {
            replace rhs by eval(rhs);
            mark definition as constant;
}}}}
```

Recall the approximation in reaching definition analysis

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- Safety? Profitability?

► GEN(B) = 
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- What about the Entry block?

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► Why?