



# COMP 181




Lecture 21  
More program analysis

November 21, 2006

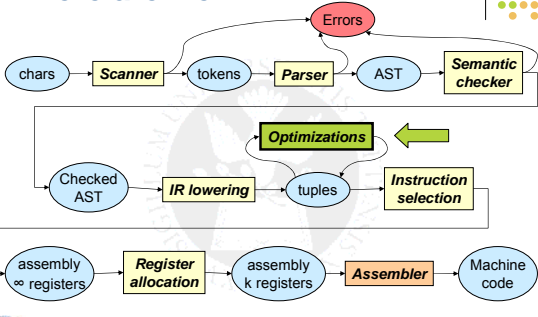

## Prelude

- What animal is this?
  - Turkey (duh)
- What national honor was almost bestowed on turkeys?
  - National bird
- What annual ritual is going on in this picture?
  - President "pardons" a turkey
  - Origin unknown
  - Last year: "Marshmallow" and "Yam" were pardoned

2

## Where are we

3

## Liveness across instructions

- How is liveness determined?
  - All variables that I uses are live before I  
*Called the uses of I*
  - All variables live after I are also live before I, unless I writes to them  
*Called the defs of I*
- Mathematically:

$$in[I] = \{b\}$$


$$a = b + 2$$

$$in[I] = \{y,z\}$$

$$x = 5$$

$$out[I] = \{x,y,z\}$$

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



4

## Flow of information

- Equation:
 

$$in[I] = ( out[i] - def[I] ) \cup use[I]$$
- Notice: information flows **backwards**
  - Need out[] sets to compute in[] sets
  - Propagate information up
- Many problems are **forward**  
Common sub-expressions, constant propagation, others

$$Live1$$

$$x = y+1$$


$$Live2$$

$$y = 2*z$$

$$Live3$$

$$if (d)$$

$$Live4$$




5

## Control flow

- Rule: A variable is live at end of block B if it is live at the beginning of any of the successors
  - Characterizes all possible executions
  - Conservative**: some paths may not actually happen
- Mathematically:
 

$$out[B] = \bigcup_{B' \in succ(B)} in[B']$$
- Again: information flows backwards



6

## System of equations

- Put parts together:

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

$$\text{out}[B] = \bigcup_{B' \in \text{succ}(B)} \text{in}[B']$$

Often called a system of **Dataflow Equations**

- Defines a system of equations (or constraints)
  - Consider equation instances for each instruction and each basic block
  - What happens with loops?
    - Circular dependences in the constraints
    - Is that a problem?



## Solving the problem

- Iterative solution:
  - Start with empty sets of live variables
  - Iteratively apply constraints
  - Stop when we reach a fixed point

For all instructions  $\text{in}[I] = \text{out}[I] = \emptyset$

Repeat

For each instruction I

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

For each basic block B

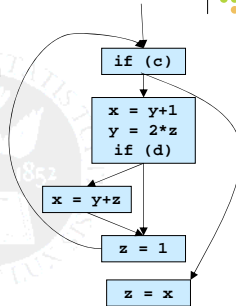
$$\text{out}[B] = \bigcup_{B' \in \text{succ}(B)} \text{in}[B']$$

Until no new changes in sets



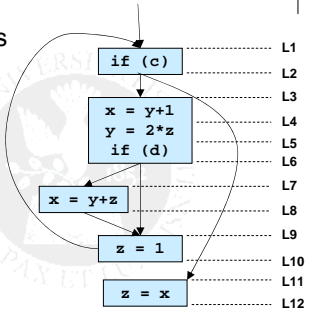
## Example

- Steps:
  - Set up live sets for each program point
  - Instantiate equations
  - Solve equations



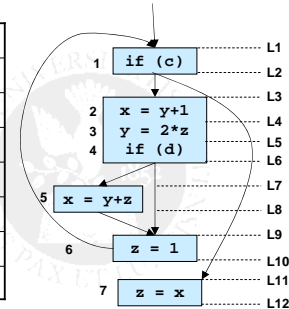
## Example

- Program points



## Example

Stmt	Defs	Uses
1		c
2	x	y
3	y	z
4		d
5	x	y, z
6	z	
7	z	x

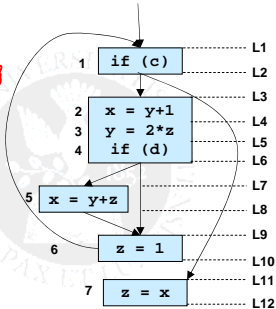


## Example

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

$$\text{out}[B] = \bigcup_{B' \in \text{succ}(B)} \text{in}[B']$$

- $L1 = L2 \cup \{c\}$
- $L2 = L3 \cup L11$
- $L3 = (L4 - \{x\}) \cup \{y\}$
- $L4 =$
- $L5 =$
- $L6 = L7 \cup L9$
- $L7 =$
- $L8 =$
- $L9 =$
- $L10 =$
- $L11 =$
- $L12 = \{ \}$



**Example**

$in[l] = (out[l] - def[l]) \cup use[l]$   
 $out[B] = \bigcup in[B']$   
 $B' \in succ(B)$

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$L1 = \{x, y, z, d, c\}$   
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**Example**

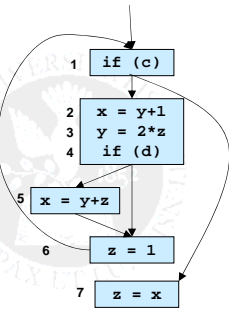
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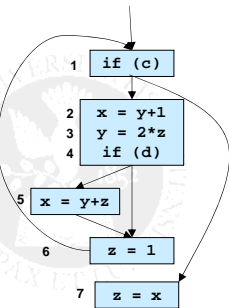
## Questions

- Why does this terminate?
- Why does this compute the right answer?
- How could we modify this for dead-code elimination?



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## Generalization

- Dataflow analysis
  - A common framework for such analysis
  - Computes information at each program point
  - Conservative: characterizes all possible program behaviors
- Methodology
  - Describe the information (e.g., live variable sets) using a structure called a *lattice*
  - Build a system of equations based on:
    - How each statement affects information
    - How information flows between basic blocks
  - Solve the system of constraints



## Lattices

- A lattice is a kind of *partial order*
  - A set of elements  $P$
  - A partial order relation  $\subseteq$ 
    - Reflexive
    - Anti-symmetric
    - Transitive
  - Called a "partial order" because not all elements are comparable
- Used to represent analysis information

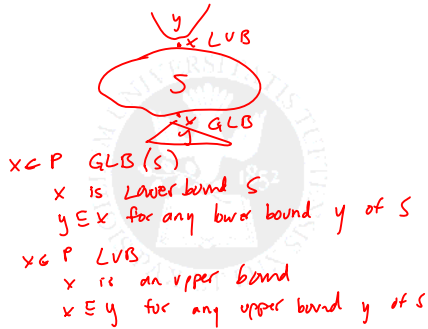


## Lower and upper bounds

$P, S$   
 $S \subseteq P$   
 $x \in P$  is a lower bound for  $S$   
 if  $x \in y \ \forall y \in S$   
 $x \in P$  is an upper bound  
 if  $y \in x \ \forall y \in S$



## LUB and GLB



## Lattices

$(L, \subseteq)$   
 any finite subset  $S$  of  $L$   
 has a unique LUB and GLB  
 two operations on lattice elements  
 meet  $x \sqcap y = \text{GLB}(\{x, y\})$   
 join  $x \sqcup y = \text{LUB}(\{x, y\})$



## Complete lattices

$(L, \subseteq)$   
 Top  $\top$  LUB(L)  
 Bottom  $\perp$  GLB(L)  
 for all  $x \in L$   $x \in \top$   
 $\perp \in x$   
 $(L, \subseteq, \sqcap, \sqcup)$



## Properties of meet and join

Associative  
 $(x \sqcap y) \sqcap z = x \sqcap (y \sqcap z)$   
 Commutative  
 $x \sqcap y = y \sqcap x$   
 Idempotent  
 $x \sqcap x = x$



## Example

- $S = \{a, b, c\}$
- $P =$  power set of  $S$
- Partial order as set inclusion  $\subseteq$ 
  - Reflexive  $x \subseteq x$
  - Anti-symmetric  $x \subseteq y$  and  $y \subseteq x$
  - Transitive
- What about LUB and GLB?  
 $x \sqcap y = z$  s.t.  $x \supseteq z$   $y \supseteq z$   $x \sqcup y = x \sqcap y$



## Graphically

- Partial order  $\subseteq$
  - Meet  $\sqcap$
  - Join  $\sqcup$
  - Top  $\{a, b, c\}$
  - Bottom  $\emptyset$
- 



