

# Control-Flow Graphs & Dataflow Analysis

CS4410: Spring 2013

# Past Few Lectures:

## High-level Intermediate Languages:

- Monadic Normal Form

## Optimization as algebraic transformations:

- $3+4 \rightarrow 7$ ,  $(\lambda x.e) v \rightarrow e[v/x]$ ,  $\text{fst}(e_1, e_2) \rightarrow e_1$

## Correctness issues:

- limiting ourselves to "pure" (valuable) expressions when we duplicate or eliminate.
- avoiding variable capture by keeping bound variables unique.

# Today:

- Imperative Representations
  - Like MIPS assembly at the instruction level.
    - except we assume an infinite # of temps
    - and abstract away details of the calling convention
  - But with a bit more structure.
- Organized into a Control-Flow graph (ch 8)
  - nodes: labeled *basic blocks* of instructions
    - single-entry, single-exit
    - i.e., no jumps, branching, or labels inside block
  - edges: jumps/branches to basic blocks
- Dataflow analysis (ch 17)
  - computing information to answer questions about data flowing through the graph.

# A CFG Abstract Syntax

Operands  $w ::= i \mid x \mid L$  (\* ints, vars, labels \*)

Cmp-op  $c ::= < \mid > \mid = \mid \dots$  (\* comparison \*)

Blocks  $B ::= \text{return } w \mid \text{jump } L$

$\mid \text{if } w1 \ c \ w2 \ \text{then } L1 \ \text{else } L2$

$\mid x := w; B$  (\* move \*)

$\mid y := *(x + i); B$  (\* load \*)

$\mid *(x + i) := y; B$  (\* store \*)

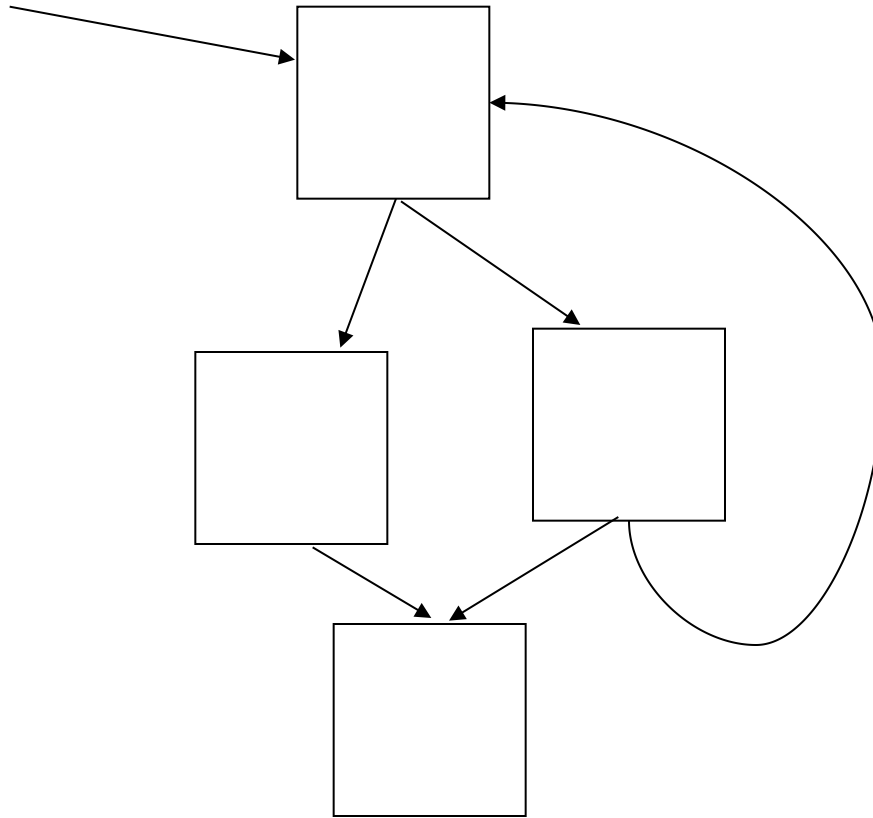
$\mid x := p(w1, \dots, wn); B$  (\* arith op \*)

$\mid x := f(w1, \dots, wn); B$  (\* call \*)

# A CFG Abstract Syntax:

```
type operand =  
    | Int of int | Var of var | Label of label  
type block =  
    | Return of operand  
    | Jump of label  
    | If of operand * cmp * operand * label * label  
    | Move of var * operand * block  
    | Load of var * operand * int * block  
    | Store of var * int * operand * block  
    | Arith of var * primop * (operand list) * block  
    | Call of var * operand * (operand list) * block  
type proc = { vars : var list,  
              prologue: label, epilogue: label,  
              blocks : (label * block) list }
```

# Conceptually



# Differences with Monadic Form

```
datatype block =  
  Return of operand  
| Jump of label  
| If of operand * test * operand * label * label  
| Move of var * operand * block  
| Load of var * operand * int * block  
| Store of var * int * operand * block  
| Arith of var * primop * (operand list) * block  
| Call of var * operand * (operand list) * block
```

- Essentially MIPS assembly with an infinite # of registers.
- No lambdas, so easy to translate to MIPS modulo register allocation and assignment.
  - Monadic form requires extra pass to eliminate lambdas and make closures explicit. (Closure Conversion)
- Unlike Monadic Form, variables are *mutable*.

# Let's Revisit Optimizations

- constant folding

$t := 3+4 \rightarrow t := 7$

- constant propagation

$t := 7; B; u := t+3 \rightarrow t := 7; B; u := 7+3$

– problem: **B** might assign a fresh value to **t**.

- copy propagation

$t := u; B; v := t+3 \rightarrow t := u; B; v := u+3$

– problems: **B** might assign a fresh value to **t** or a fresh value to **u**!



# More Optimizations:

- Dead code elimination

$x := e; B; \text{jump } L \rightarrow B; \text{jump } L$

– problem: the block  $L$  might use  $x$ .

$x := e_1; B_1; x := e_2; B_2 \rightarrow B_1; x := e_2; B_2$  ( $x$  not in  $B_1$ )

- Common sub-expression elimination

$x := y + z; B_1; w := y + z; B_2 \rightarrow x := y + z; B_1; w := x; B_2$

– problem:  $B_1$  might change  $x, y$ , or  $z$ .

# Point:

## Optimization on a functional representation:

- we only had to worry about variable capture.
- we could avoid this by renaming all of the variables so that they were unique.
- then:  $\text{let } x=p(v_1, \dots, v_n) \text{ in } e \equiv e[p(v_1, \dots, v_n)/x]$

## Optimization in an imperative representation:

- we have to worry about intervening updates.
  - for defined variable, similar to variable capture.
  - but we must also worry about *free* variables.
  - $x:=p(v_1, \dots, v_n); B \equiv B[p(v_1, \dots, v_n)/x]$  only when  $B$  doesn't modify  $x$  nor modifies any of the  $v_i$ !
- on the other hand, a graph representation makes it possible to be more precise about the *scope* of a variable.

# Consider:

```
let k(x,y) = let z=x+1 in ... c(z,y)
in let a = x+1 in
  if b then ... k(x,a)
  else ... k(x,a)
```

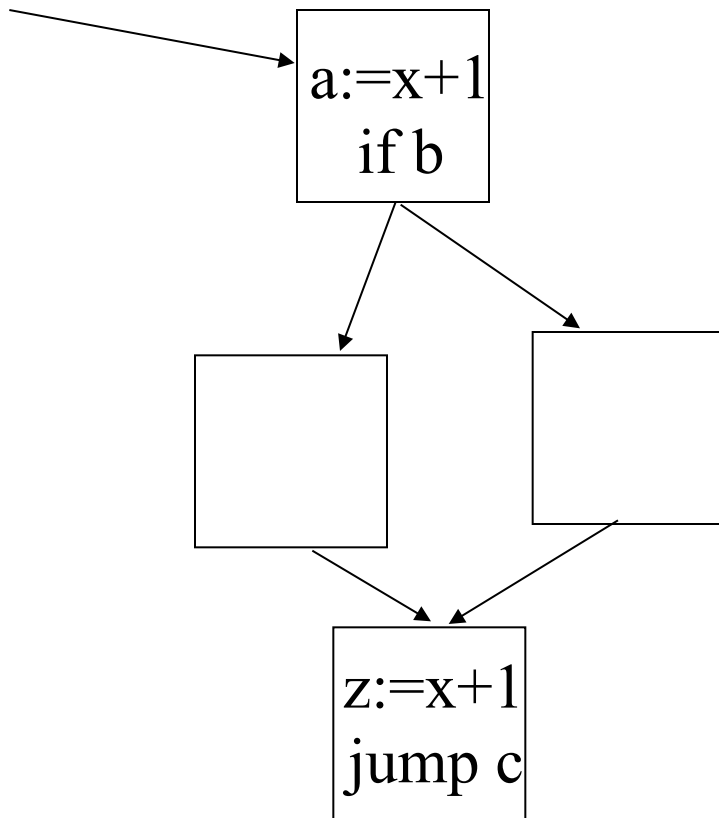
If we inline the function k, we get:

```
let a=x+1 in
  if b then ... let z=x+1 in ...c(z,y)
  else ... let z=x+1 in ...c(z,y)
```

so we can do CSE on  $x+1$ , eliminating  $z$ .

But the price paid is that we had to duplicate the function body. Can we do this *without* inlining?

# In the Graph World:



Monadic terms only let you build trees, and the scoping rules follow the tree.

To localize scope, we end up copying sub-trees.

What we need is some way to accommodate "scope" across paths in a graph.

(CPS & SSA get best of both)

# Constant Propagation: Try #1

```
type env = var -> operand
val init_env = fun (x:var) => Var x
val subst : env -> operand -> operand
val extend : env -> var -> operand -> env

let rec cp (env:env) (b:block) : block =
  match b with
  | Return v -> Return (subst env v)
  | Jump L -> Jump L
  | If(v1,t,v2,L1,L2) ->
      If(subst env v1,t,subst env v2,L1,L2)
  | Move(x,v,b) ->
      let v' = subst env v
      in cp (extend env x v') b
  | Arith(x,p,vs,b) ->
      Arith(x,p,map (subst env) vs, cp env b)
```

# Problem:

**L1:    **x := 3;****

****j L2;****

**L2:    **return x****

# Constant Propagation: Try #2

```
let rec cp (env:env) (b:block) : block =
  match b with
  | Return v -> Return (subst env v)
  | Jump L ->
      (setblock L (cp env (getblock L)));
      Jump L)
  | If(v1,t,v2,L1,L2) ->
      If(subst env v1,t,subst env v2,L1,L2)
  | Move(x,v,b) ->
      let v' = subst env v
      in cp (extend env x v') b
  | Arith(x,p,vs,b) ->
      Arith(x,p,map (subst env) vs, cp env b)
  | ...
```

# Problem:

**L1:     $x := 3;$**

**j L2**

**L2:     $y := x;$**

**j L1**



# Constant Propagation: Try #3

```
let rec cp (env:env) (b:block) : block =
  match b with
  | Return v -> Return (subst env v)
  | Jump L -> Jump L
  | If (v1,t,v2,L1,L2) ->
      If(subst env v1,t,subst env v2,L1,L2)
  | Move(x,v,b) ->
      let v' = subst v env
      in Move(x,v',cp (extend env x v') b)
  | Arith(x,p,vs,b) ->
      Arith(x,p,map (subst env) vs, cp env b)
  | ...
```

# Problem

<b>x</b> := 3;	{ <b>x</b> -> 3 }	<b>x</b> := 3;
<b>y</b> := <b>x</b> +1;		<b>y</b> := 3+1;
<b>x</b> := <b>x</b> -1;		<b>x</b> := 3-1;
<b>z</b> := <b>x</b> +2;		<b>z</b> := 3+2;

# Constant Propagation: Try #4

```
let rec cp (env:env) (b:block) : block =
  match b with
  | Return v -> Return (subst env v)
  | Jump L -> Jump L
  | If (v1,t,v2,L1,L2) ->
      If(subst env v1,t,subst env v2,L1,L2)
  | Move(x,v,b) ->
      let v' = subst env v
      in Move(x,v',cp (extend env x v') b)
  | Arith(x,p,vs,b) ->
      Arith(x,p,map (subst env) vs,
            cp (extend env x (Var x)) b)
  | ...
```

# Moral:

- Can't just hack this up with simple substitution.
- To extend across blocks, we have to be careful about termination.

# Available Expressions:

A definition " $x := e$ " reaches a program point  $p$  if there is no intervening assignment to  $x$  or to the free variables of  $e$  on any path leading from the definition to  $p$ . We say  $e$  is *available* at  $p$ .

If " $x := e$ " is available at  $p$ , we can use  $x$  in place of  $e$  (i.e., for common sub-expression elimination.)

How do we compute the available expressions at each program point?

# Gen and Kill

- Suppose  $D$  is a set of assignments that reaches the program point  $p$ .
- Suppose  $p$  is of the form " $x := e_1; B$ "
- Then the statement " $x := e_1$ "
  - *generates* the definition " $x := e_1$ ", and
  - *kills* any definition " $y := e_2$ " in  $D$  such that either  $x = y$  or  $x$  is in  $FV(e_2)$ .
- So the definitions that reach  $B$  are:  
 $D - \{ y := e_2 \mid x = y \text{ or } x \text{ in } FV(e_2) \} + \{ x := e_1 \}$

# More Generally:

<u>statement</u>	<u>gen's</u>	<u>kill's</u>
$x := v$	$x := v$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$x := v_1 \text{ p } v_2$	$x := v_1 \text{ p } v_2$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$x := *(v+i)$	$\{\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$*(v+i) := x$	$\{\}$	$\{\}$
jump L	$\{\}$	$\{\}$
return v	$\{\}$	$\{\}$
if $v_1 \text{ r } v_2$ goto L1 else goto L2	$\{\}$	$\{\}$
$x := \text{call } v(v_1, \dots, v_n)$	$\{\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$

# Flowing through the Graph:

- Given the available expressions  $D_{in}[L]$  that flow into a block labeled  $L$ , we can compute the definitions  $D_{out}[L]$  that flow out by just using the gen & kill's for each statement in  $L$ 's block.
- For each block  $L$ , we can define:
  - $succ[L]$  = the blocks  $L$  might jump to.
  - $pred[L]$  = the blocks that might jump to  $L$ .
- We can then flow  $D_{out}[L]$  to all of the blocks in  $succ[L]$ .
- They'll compute new  $D_{out}$ 's and flow them to their successors and so on.



# Algorithm Sketch:

initialize  $Din[L]$  to be the empty set.

initialize  $Dout[L]$  to be the available expressions that flow out of block  $L$ , assuming  $Din[L]$  are the set flowing in.

loop until no change {

  for each  $L$ :

$In := \text{intersection}(Dout[L'])$  for all  $L'$  in  $\text{pred}[L]$

    if  $In == Din[L]$  then continue to next block.

$Din[L] := In$ .

$Dout[L] := \text{flow } Din[L] \text{ through } L\text{'s block.}$

}

# Termination and Speed:

- We're ensured that this will terminate because  $Din[L]$  can at worst grow to the set of all assignments in the program.
  - If  $Din[L]$  doesn't change, neither will  $Dout[L]$ .
- There are a number of tricks used to speed up the analysis:
  - can calculate gen/kill for a whole block before running the algorithm.
  - can keep a work queue that holds only those blocks that have changed.

# Gen/Kill Available Expressions:

<u>statement</u>	<u>gen's</u>	<u>kills</u>
$x := v$	$\{x := v\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$x := p(v_1, v_2)$	$\{x := v_1 \text{ p } v_2\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$x := *(v+i)$	$\{\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$
$*(v+i) := x$	$\{\}$	$\{\}$
$x := v(\dots)$	$\{\}$	$\{y := e \mid x = y \text{ or } x \text{ in } e\}$

# Extending to Basic Blocks

Gen[B]:

- $\text{Gen}[s; B] = (\text{Gen}[s] - \text{Kill}[B]) \cup \text{Gen}[B]$
- $\text{Gen}[\text{return } v] = \{ \}$
- $\text{Gen}[\text{jump } L] = \{ \}$
- $\text{Gen}[\text{if } r(v_1, v_2) \text{ then } L_1 \text{ else } L_2] = \{ \}$

Kill[B]:

- $\text{Kill}[s; B] = \text{Kill}[s] \cup \text{Kill}[B]$
- $\text{Kill}[\text{return } v] = \{ \}$
- $\text{Kill}[\text{jump } L] = \{ \}$
- $\text{Kill}[\text{if } r(v_1, v_2) \text{ then } L_1 \text{ else } L_2] = \{ \}$

# Equational Interpretation:

We need to solve the following equations:

- $\text{Din}[L] = \text{Dout}[L_1] \cap \dots \cap \text{Dout}[L_n]$   
where  $\text{pred}[L] = \{L_1, \dots, L_n\}$
- $\text{Dout}[L] = (\text{Din}[L] - \text{Kill}[L]) \cup \text{Gen}[L]$

Note that for cyclic graphs, this isn't a definition, it's an equation.

- e.g.,  $x * x = 2y$  is not a definition for  $x$ .
- must solve for  $x$ .
- might have 0 or  $> 1$  solution.

# Solving the Equations

initialize  $Din[L]$  to be the empty set.

initialize  $Dout[L]$  to be  $Gen[L]$ .

loop until no change {

  for each  $L$ :

$In := Dout[L_1] \cap \dots \cap Dout[L_n]$   
      where  $pred[L] = \{L_1, \dots, L_n\}$

    if  $In == Din[L]$  then continue to next block.

$Din[L] := In$ .

$Dout[L] := (Din[L] - Kill[L]) \cup Gen[L]$

}

# Recap:

## Control-flow graphs:

- nodes are basic blocks
  - single-entry, single-exit sequences of code
  - statements are imperative
  - variables have no nested scope
- edges correspond to jumps/branches

## Dataflow analysis:

- Example: available expressions
- Iterative solution

Next: Another dataflow analysis - Liveness

# Liveness Analysis

- A variable  $x$  is *live* at a point  $p$  if there is some path from  $p$  to a use of  $x$  that does not go through a definition of  $x$ .
  - Liveness is backwards: flows from uses backwards
  - Available expressions forwards: flows from definitions.
- We would like to calculate the set of live variables coming into and out of each statement.
  - dead code:  $x:=e; B$  if  $x$  is not live coming out of  $B$ , then we can delete the assignment.
  - register allocation: if  $x$  and  $y$  are live at the same point  $p$ , then they can't share a register.



# Gen & Kill for Liveness

A *use* of  $x$  generates liveness, while a definition kills it.

<u>statement</u>	<u>gen's</u>	<u>kills</u>
$x := y$	$\{y\}$	$\{x\}$
$x := p(y, z)$	$\{y, z\}$	$\{x\}$
$x := *(y + i)$	$\{y\}$	$\{x\}$
$*(v + i) := x$	$\{x\}$	$\{\}$
$x := f(y_1, \dots, y_n)$	$\{f, y_1, \dots, y_n\}$	$\{x\}$

# Extending to blocks:

Gen[B]:

- $\text{Gen}[s; B] = (\text{Gen}[B] - \text{Kill}[s]) \cup \text{Gen}[s]$
- $\text{Gen}[\text{return } x] = \{x\}$
- $\text{Gen}[\text{jump } L] = \{\}$
- $\text{Gen}[\text{if } r(x,z) \text{ then } L1 \text{ else } L2] = \{x,z\}$

Kill[B]:

- $\text{Kill}[s; B] = \text{Kill}[s] \cup \text{Kill}[B]$
- $\text{Kill}[\text{return } v] = \{\}$
- $\text{Kill}[\text{jump } L] = \{\}$
- $\text{Kill}[\text{if } v1 \text{ r } v2 \text{ then } L1 \text{ else } L2] = \{\}$

# Equations for graph:

We need to solve:

- $\text{LiveIn}[L] = \text{Gen}[L] \cup (\text{LiveOut}[L] - \text{Kill}[L])$
- $\text{LiveOut}[L] = \text{LiveIn}[L_1] \cup \dots \cup \text{LiveIn}[L_n]$   
where  $\text{succ}[L] = \{L_1, \dots, L_n\}$

So if LiveIn changes for some successor, our LiveOut changes, which then changes our LiveIn, which then propagates to our predecessors...

# Liveness Algorithm

initialize LiveIn[L] := Gen[L].

initialize LiveOut[L] := { }.

loop until no change {

  for each L:

    Out := LiveIn[L<sub>1</sub>] U ... U LiveIn[L<sub>n</sub>]  
      where succ[L] = {L<sub>1</sub>, ..., L<sub>n</sub>}

    if Out == LiveOut[L] then continue to next block.

    LiveOut[L] := Out.

    LiveIn[L] := Gen[L] U (LiveOut[L] - Kill[L]).

}

# Speeding up the Analysis

- For liveness, flow is backwards.
  - so processing successors before predecessors will avoid doing another loop.
  - of course, when there's a loop, we have to just pick a place to break the cycle.
- For available expressions, flow is forwards.
  - so processing predecessors before successors will avoid doing another loop.
- Only need to revisit blocks that change.
  - keep a priority queue, sorted by flow order

# Representing Sets (See Appel)

- Consider liveness analysis:
  - need to calculate sets of variables.
  - need efficient union, subtraction.
- Usual solution uses bitsets
  - use bitwise operations (e.g.,  $\&$ ,  $|$ ,  $\sim$ , etc.) to implement set operations.
  - note: this solution scales well, but has bad asymptotic complexity compared to a sparse representation.
- Complexity of whole liveness algorithm?
  - worst case,  $O(n^4)$  assuming set ops are  $O(n)$
  - in practice it's roughly quadratic.

# Coming up...

- Register allocation [ch. 11]
  - seen first part: liveness analysis
  - next: construct interference graph
  - then: graph coloring & simplification
- Loop-oriented optimizations [ch. 18]
  - e.g., loop-invariant removal
- CPS & SSA