Dataflow Analysis

15-411/15-611 Compiler Design

Seth Copen Goldstein

September 24, 2020

Today

- Full Employment Theorem
- Local Optimization: Value Numbering
- Dataflow Analysis
 - reaching definitions
 - liveness
 - available expressions
 - very busy expressions
- Framework

Optimizations

- Register Allocation
- Common subexpression elimination
- Constant Propagation
- Copy propagation
- Dead-code elimination
- Loop optimizations
 - Hoisting
 - Induction variable elimination
- And, many many more.

How many?

Infinitely Many!

- Lets assume there existed optc: A perfect optimizing compiler
- optc(P) ⇒ the smallest possible P' which has equivalent behavior to P.
- Then, ?

Infinitely Many!

- Lets assume there existed optc: A perfect optimizing compiler
- optc(P) ⇒ the smallest possible P' which has equivalent behavior to P.
- Then, if P never halts, it should produce:

L1: jmp L1

 So, instead we build "optimizing compilers" and there is always a job for a compiler writer to invent new optimizations!

Approach to Optimization

- Three parts to any optimization:
 - Determine if an optimization is legal
 - Determine if an optimization is profitable
 - Implement optimization
- Consider also compilation time

Scope of Optimization

- Local
 Within a basic block
- Global
 Within a function, across basic blocks
- Interprocedural
 The entire program (file), across functions and basic blocks.
- Whole progam
 Across all the files

Value Numbering

- (Originally) A local optimization for:
 - common sub-expression elimination
 - constant folding
 - constant propagation
 - dead-code removal
- A long history
- An ancestor to SSA

Value Numbering Example

```
void quicksort(int m, int n) {
  int i = m-1;
  int j = n;
  int v;
  int x;
  if n <= m then return;
  v = a[n];
  while (true) {
       i = i+1;
      while (a[i] < v) i = i+1;
       i = i-1;
      while (a[j] > v) j = j-1;
       if i>=j break;
       x = a[i]; a[i] = a[j]; a[j] = x
  }
  x = a[i]; a[i] = a[n]; a[n] = x;
  quicksort(m,j);
  quicksort(i+1), n);
```

Example: CSE

```
void quicksort(int m, int n) {
  int i = m-1;
  int j = n;
  int v;
  int x;
  if n <= m then return;
  v = a[n];
  while (true) {
      i = i+1;
      while (a[i] < v) i = i+1;
      j = j-1;
      while (a[j] > v) j = j-1;
      if i>=j break;
      x = a[i]; a[i] = a[j]; a[j] = x
  x = a[i]; a[i] = a[n]; a[n] = x;
  quicksort(m,j);
  quicksort(i+1), n);
```

```
B1: i
        = m - 1
   j = n
   t1 = 4*n
        = a[t1]
B2: i = i + 1
   t2 = 4 * i
   t3 = a[t2]
   cjump t3<v B2, B3
B3: j = j - 1
   t4 = 4 * j
        = a[t4]
   t5
   cjump t5>v B3, B4
B4: cjump i >= j B6, B5
```

Example: CSE

```
void quicksort(int m, int n) {
  int i = m-1;
  int j = n;
  int v;
  int x;
  if n <= m then return;
  v = a[n];
  while (true) {
       i = i+1;
      while (a[i] < v) i = i+1;
       i = i-1;
      while (a[j] > v) j = j-1;
       if i>=j break;
      x = a[i]; a[i] = a[j]; a[j] = x
  }
  x = a[i]; a[i] = a[n]; a[n] = x;
  quicksort(m,j);
  quicksort(i+1), n);
```

```
B5: t6 = 4*i
   x = a[t6]
   t7 = 4 * i
   t8 = 4 * i
   t9 = a[t8]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump B2
B6: t11 = 4*i
   x = a[t11]
   t12 = 4 * i
   t13 = 4 * n
   t14 = a[t13]
   a[t12] = t14
   t15 = 4*n
   a[t15] = x
```

Example: CSE

```
B1:
     i = m - 1
                           B5:
                                t6 = 4*i
     j
                                x = a[t6]
          = n
     t1
       = 4*n
                                t7 = 4 * i
                                t8 = 4 * j
     v = a[t1]
                                t9 = a[t8]
    i = i + 1
B2:
                                a[t7] = t9
     t2 = 4 * i
                               t10 = 4*j
     t3 = a[t2]
                               a[t10] = x
     cjump t3<v B2, B3
                                jump B2
                           B6: t11 = 4*i
     j = j - 1

t4 = 4 * j
B3:
                                x = a[t11]
                                t12 = 4 * i
     t5 = a[t4]
                                t13 = 4 * n
     cjump t5>v B3, B4
                                t14 = a[t13]
                                a[t12] = t14
                                t15 = 4*n
B4:
   cjump i >= j B6, B5
                                a[t15] = x
```

Local CSE

```
B5: t6 = 4*i
B1:
     i = m - 1
      j
                                   x = a[t6]
          = n
      t1
        = 4*n
                                   t7 = 4 * i
                                   t8 = 4 * j
      v = a[t1]
                                   t9 = a[t8]
    \mathtt{i} = \mathtt{i} + \mathtt{1}
                                   a[t7] = t9
B2:
     t2 = 4 * i
                                   t10 = 4*j
      t3 = a[t2]
                                  a[t10] = x
      cjump t3<v B2, B3
                                   jump B2
                             B6: t11 = 4*i
      j = j - 1

t4 = 4 * j
B3:
                                   x = a[t11]
                                   t12 = 4 * i
      t5 = a[t4]
                                   t13 = 4 * n
      cjump t5>v B3, B4
                                   t14 = a[t13]
                                   a[t12] = t14
                                   t15 = 4*n
B4:
   cjump i >= j B6, B5
                                   a[t15] = x
```

Local CSE

```
B5: t6 = 4*i
B1:
     i = m - 1
     j
                                x = a[t6]
          = n
     t1
       = 4*n
                                t7 = 4 * i
                                t8 = 4 * j
     v = a[t1]
                                t9 = a[t8]
    i = i + 1
                                a[t6] = t9
B2:
     t2 = 4 * i
                                t10 = 4*j
     t3 = a[t2]
                                a[t8] = x
     cjump t3<v B2, B3
                                jump B2
                           B6: t11 = 4*i
     j = j - 1

t4 = 4 * j
B3:
                                x = a[t11]
                                t12 = 4 * i
     t5 = a[t4]
                                t13 = 4 * n
     cjump t5>v B3, B4
                                t14 = a[t13]
                                a[t11] = t14
                                t15 = 4*n
B4:
   cjump i >= j B6, B5
                                a[t13] = x
```

Local CSE

```
B1: i = m - 1
                           B5: t6 = 4*i
         = n
                                 x = a[t6]
     t1 = 4*n
                                t8 = 4 * j
     v = a[t1]
                                 t9 = a[t8]
    i = i + 1
B2:
                                 a[t6] = t9
     t2 = 4 * i
     t3 = a[t2]
                                 a[t8] = x
     cjump t3<v B2, B3
                                 jump B2
                           B6: t11 = 4*i
     j = j - 1

t4 = 4 * j
B3:
                                 x = a[t11]
                                 t13 = 4 * n
     t5 = a[t4]
     cjump t5>v B3, B4
                                 t14 = a[t13]
                                 a[t11] = t14
B4:
    cjump i >= j B6, B5
                                 a[t13] = x
```

How do we find this?

```
B5: t6 = 4*i

x = a[t6]

t7 = 4 * i

t8 = 4 * j

t9 = a[t8]

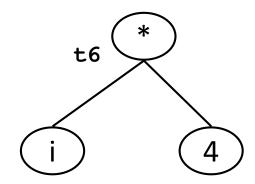
a[t7] = t9

t10 = 4*j

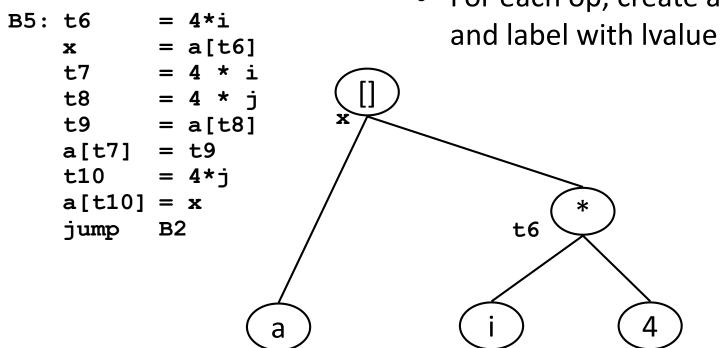
a[t10] = x

jump B2
```

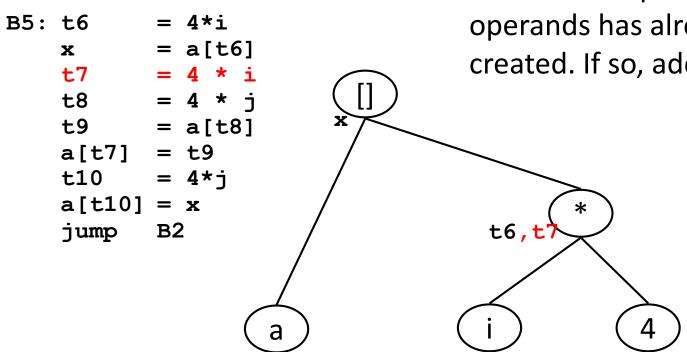
- For each var & constant not seen before create a leaf
- For each op, create a node and label with Ivalue

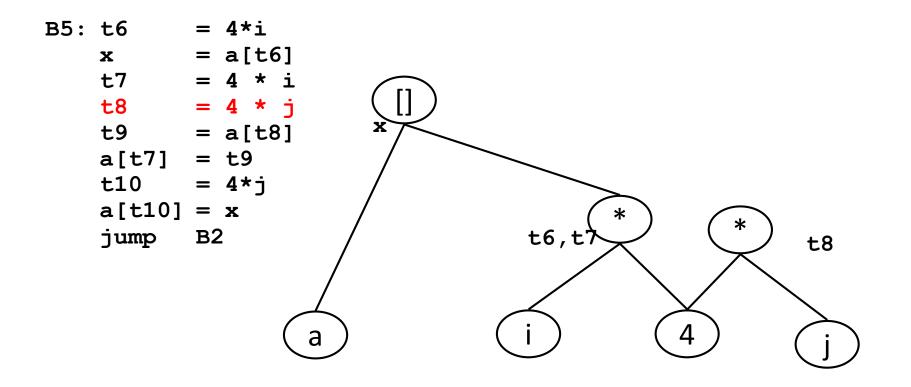


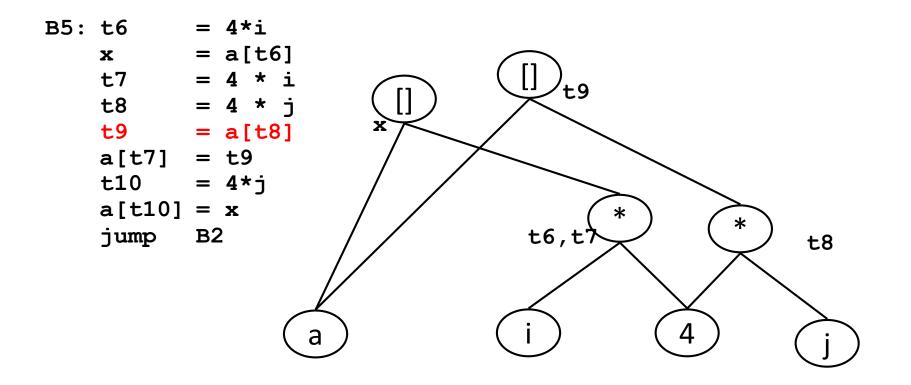
- For each var & constant not seen before create a leaf
- For each op, create a node

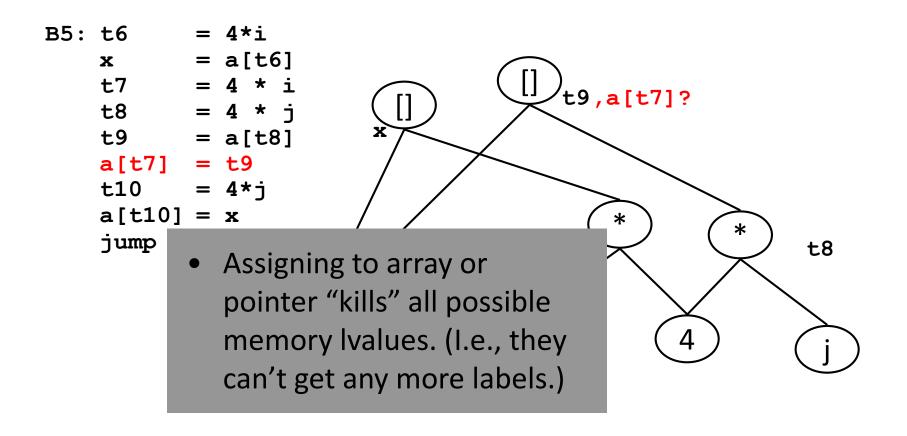


 If you have seen all rvalues before see if an interior node with same "op" and operands has already been created. If so, add a label.





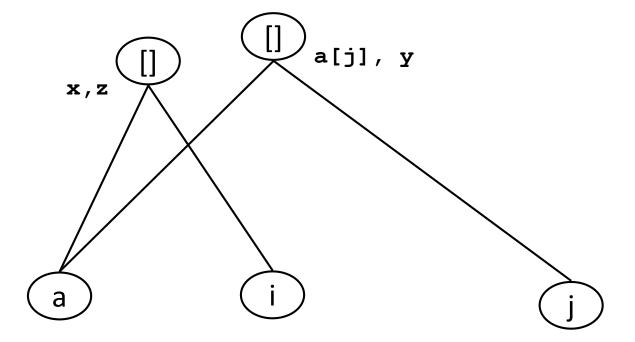


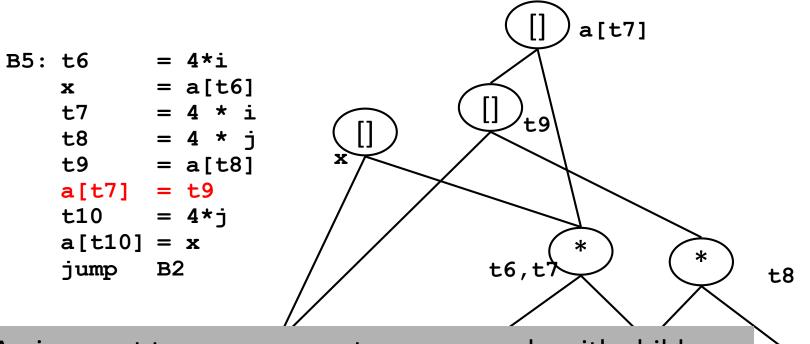


Memory References

Becomes:

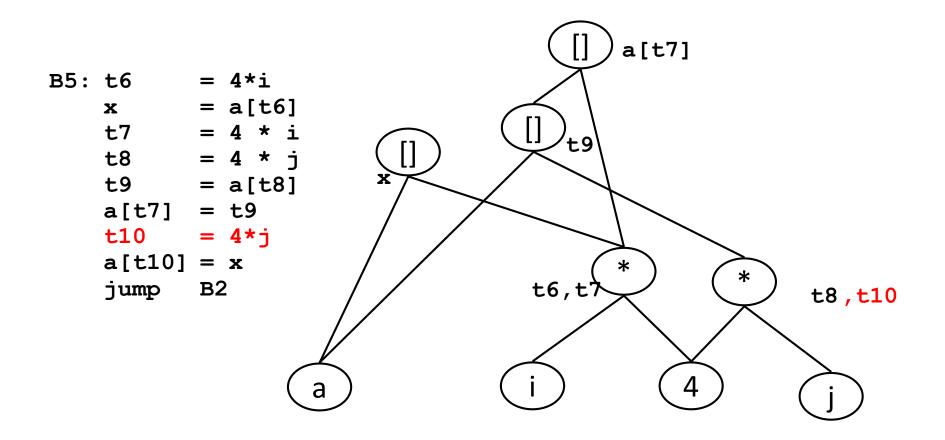
x = a[i] z = x a[j] = y

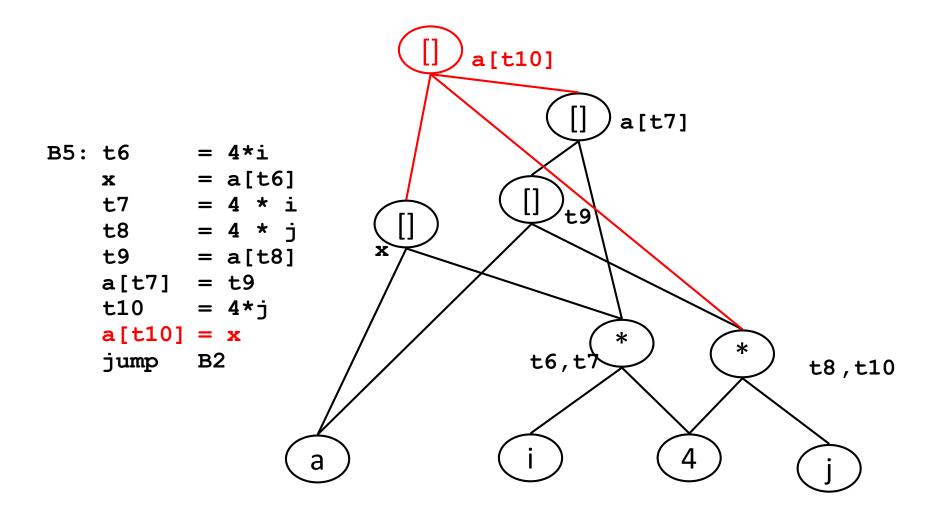




Assignment to an array creates a new node with children:

- index
- old value of array
- value assigned





Using the DAG to recreate blocks

- Order of evaluation is any topological sort
- We pick a node. Assign it to ONE of the labels (hopefully one needed later in the program)
- If we end up with identifiers that are needed after this block, insert move statements.
- If a node has no identifiers, make up a new one.
- Caveats:
 - Procedure calls kill nodes
 - -A[] = and *p = kill nodes

```
B5: t6 = 4*i
   x = a[t6]
   t7 = 4 * i
                          a[t10]
   t8 = 4 * j
   t9 = a[t8]
                                    a[t7]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump
         B2
                              t6, t7
                                                t8,t10
```

```
B5: t6 = 4*i
   x = a[t6]
   t7 = 4 * i
                            a[t10]
   t8 = 4 * j
   t9 = a[t8]
                                      a[t7]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump
          B2
B5: t8 = 4 * j
t6 = 4 * i
                                t6, t7
                                                   t8,t10
                 a
```

```
B5: t6
         = 4*i
   x = a[t6]
   t7 = 4 * i
                          a[t10]
   t8 = 4 * j
   t9 = a[t8]
                                   a[t7]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump
         B2
B5: t8
   t6
                              t6, t7
                                               t8,t10
   t9 = a[t8]
         = a[t6]
   X
                a
```

```
B5: t6 = 4*i
   x = a[t6]
   t7 = 4 * i
                           a[t10]
   t8 = 4 * j
   t9 = a[t8]
                                     a[t7]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump
         B2
B5: t8 = 4 * j
t6 = 4 * i
                               t6, t7
                                                  t8,t10
   t9 = a[t8]
   x = a[t6]
   a[t6] = t9
                 a
```

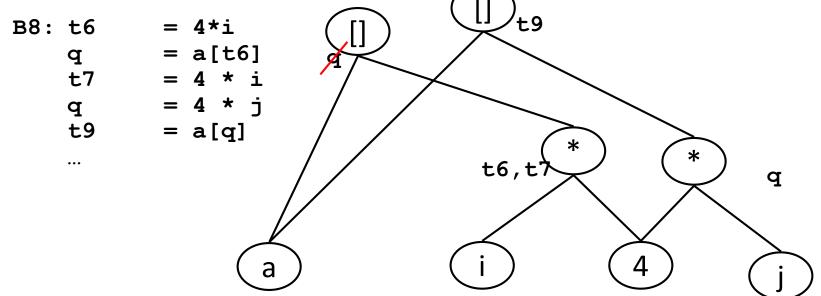
```
B5: t6 = 4*i
   x = a[t6]
   t7 = 4 * i
                           a[t10]
   t8 = 4 * j
   t9 = a[t8]
                                     a[t7]
   a[t7] = t9
   t10 = 4*j
   a[t10] = x
   jump
         B2
B5: t8 = 4 * j
t6 = 4 * i
                               t6, t7
                                                  t8,t10
   t9 = a[t8]
   x = a[t6]
   a[t6] = t9
   a[t8]
         = x
                 a
```

Other uses for DAGs

 Can determine those variables that can be live at end of a block.

Can determine those variables that are live at

start of block.

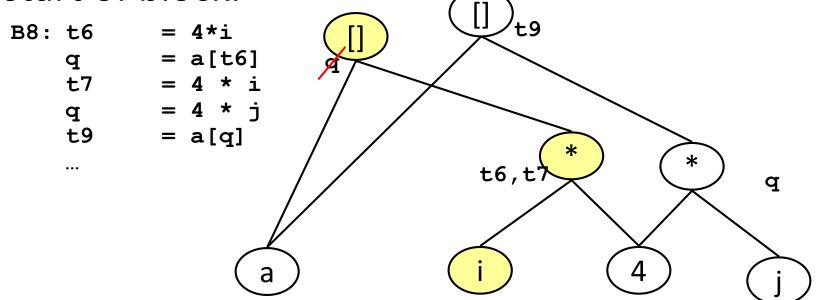


Dead code too?

 Can determine those variables that can be live at end of a block.

Can determine those variables that are live at

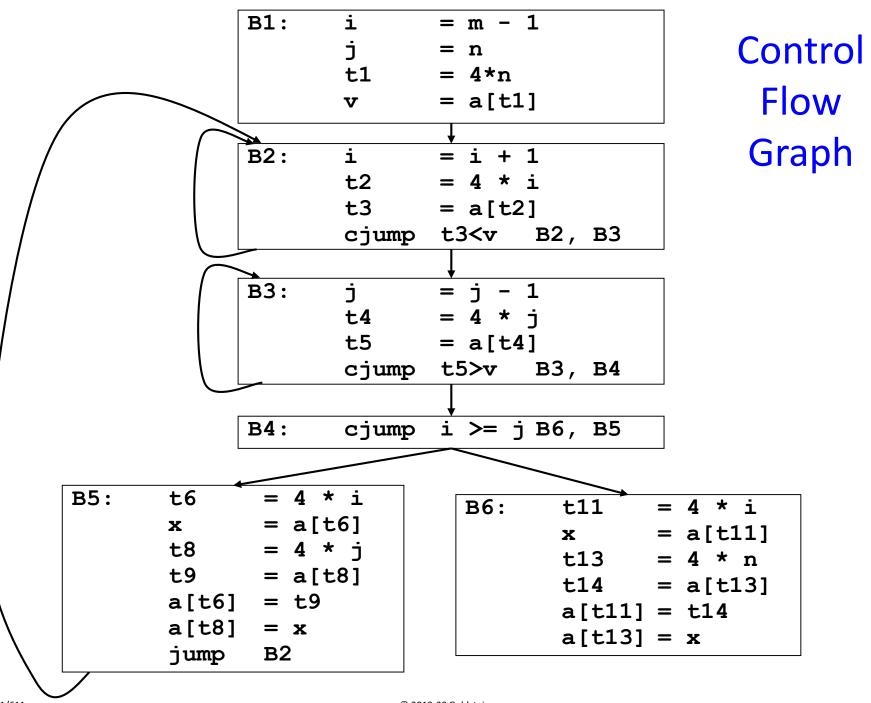
start of block.

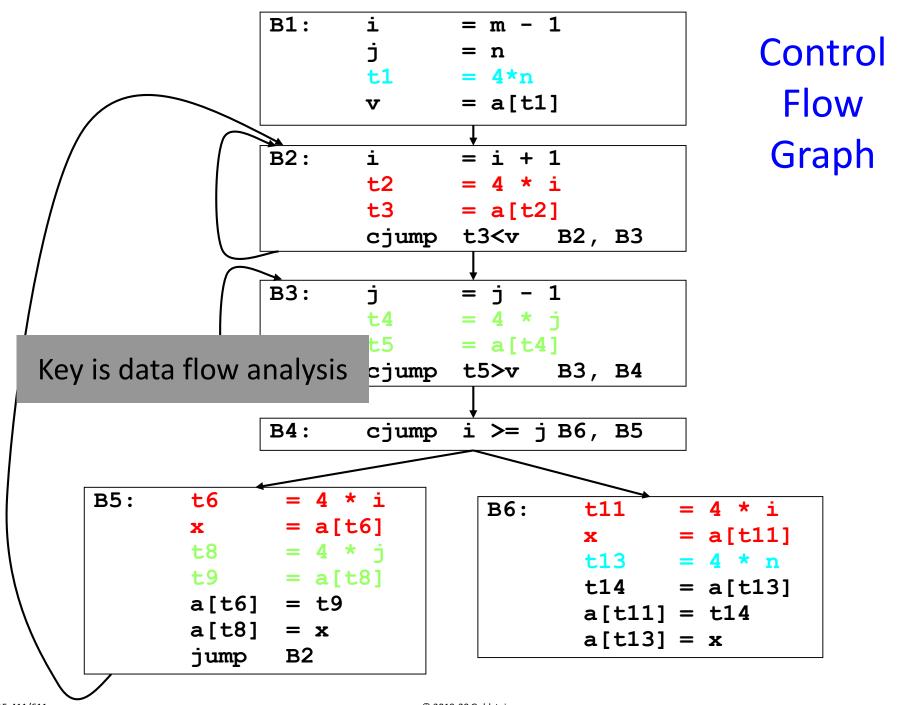


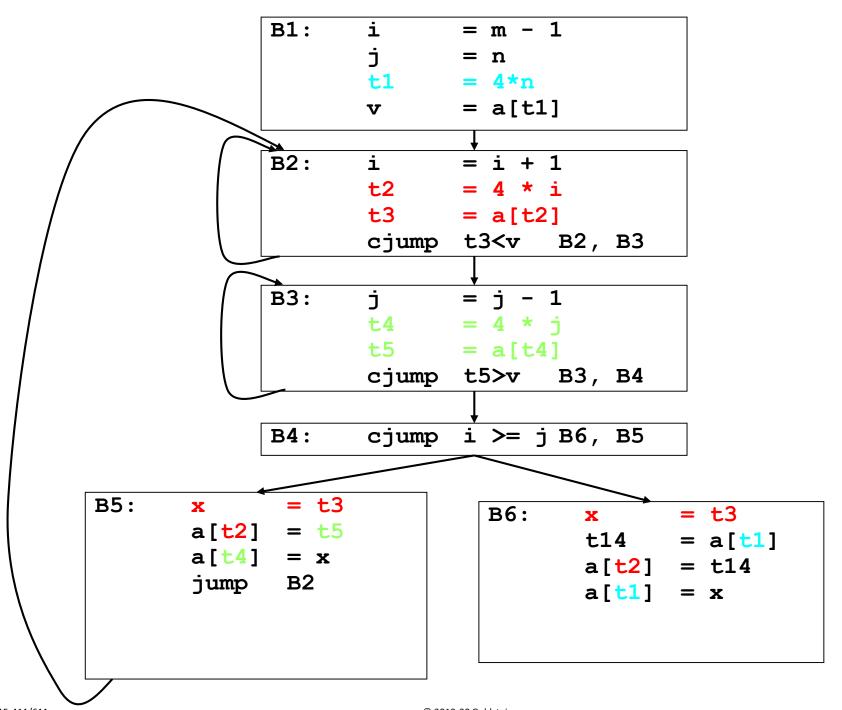
Can we do better?

```
B1: i = m - 1
                             B5: t6 = 4 * i
      j
          = n
                                   x = a[t6]
      t1 = 4*n
                                   t8 = 4 * j
      v = a[t1]
                                   t9 = a[t8]
    \mathtt{i} = \mathtt{i} + \mathtt{1}
                                   a[t6] = t9
B2:
     t2 = 4 * i
      t3 = a[t2]
                                   a[t8] = x
      cjump t3<v B2, B3
                                   jump B2
                             B6: t11 = 4 * i
      j = j - 1

t4 = 4 * j
B3:
                                   x = a[t11]
                                   t13 = 4 * n
      t5 = a[t4]
      cjump t5>v B3, B4
                                   t14 = a[t13]
                                   a[t11] = t14
B4:
   cjump i >= j B6, B5
                                   a[t13] = x
```

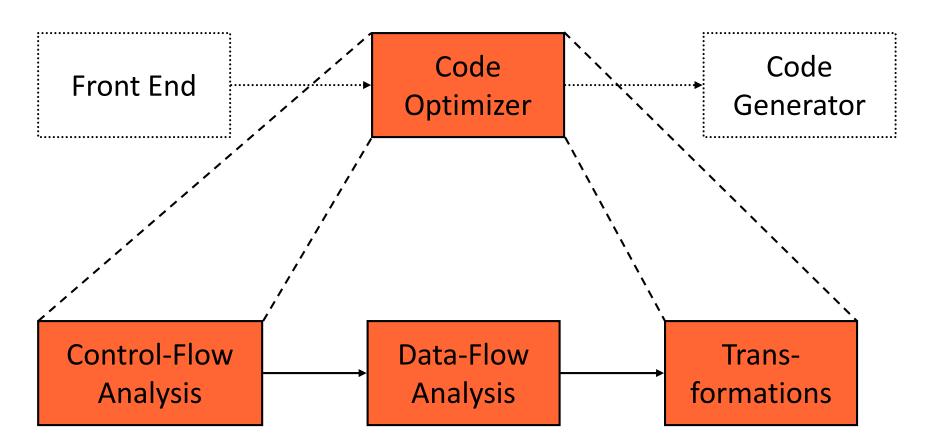






38

The Optimizer



Optimizations

- Register Allocation
 Liveness or reaching definitions
- Common subexpression elimination
 Available expressions and reaching expressions
- Constant Propagation
- Copy propagation
- Dead-code elimination
- Loop optimizations
 - Hoisting
 - Induction variable elimination

Dataflow Analysis

•Goal:

- -Answers: Is it legal to perform an optimization?
- -(Not answering: "it is beneficial?")
- A framework for proving facts about program
- Reasons about lots of little facts
- Little or no interaction between facts
 - Works best on properties about how program computes
- Based on all paths through program
 - including infeasible paths

A sample program

```
int fib10(void) {
  int n = 10;
                                 n <- 10
                              1:
  int older = 0;
                              2:
                                   older <- 0
  int old = 1;
                              3: old <- 1
  int result = 0;
                              4: result <- 0
                              5: if n \le 1 goto 14
  int i;
                              6: i < -2
  if (n \le 1) return n;
                              7:
                                    if i > n goto 13
  for (i = 2; i < n; i++) {
     result = old + older;
                           8:
                                    result <- old + older
     older = old;
                              9:
                                    older <- old
     old = result;
                              10: old <- result
                              11: i \leftarrow i + 1
  return result;
                              12:
                                    JUMP 7
                              13:
                                    return result
                              14:
                                    return n
```

Simple Constant Propagation

- Can we do SCP?
- How do we recognize it?

What aren't we doing?

- Metanote:
 - keep opts simple!
 - Use combined power

```
1: n <- 10
```

2: older <- 0

3: old <- 1

4: result <- 0

5: if $n \le 1$ goto 14

6: i <- 2

7: if i > n goto 13

8: result <- old + older

9: older <- old

10: old <- result</pre>

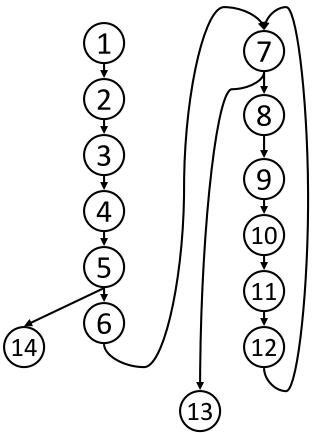
11: $i \leftarrow i + 1$

12: JUMP 7

13: return result

Reaching Definitions

A definition of variable v at program point d reaches program point u if there exists a path of control flow edges from d to u that does not contain a definition of v.



```
1:
      n < -10
2:
      older <- 0
3:
      old <- 1
4:
      result <- 0
5:
      if n <= 1 goto 14
6:
      i <- 2
7:
      if i > n goto 13
8:
      result <- old + older
9:
      older <- old
10:
      old <- result
11:
      i < -i + 1
12:
      JUMP 7
13:
      return result
14:
      return n
```

Reaching Definitions (ex)

• 1 reaches 5, 7, and 14

```
14, Really?
```

Meta-notes:

- (almost) always conservative
- only know what we know
- Keep it simple:
 - What opt(s), if run before this would help
 - What about:

```
1: x < 0
```

2: if (false) x<-1

3: ... x ...

- Does 1 reach 3?
- What opt changes this?

```
1:
      n < -10
2:
      older <- 0
3:
      old <-1
4:
      result <- 0
5:
      if n <= 1 goto 14
6:
      i <- 2
7:
      if i > n goto 13
8:
      result <- old + older
9:
      older <- old
10:
      old <- result
11:
      i < -i + 1
12:
      JUMP 7
13:
      return result
14:
      return n
```

Calculating Reaching Definitions

A definition of variable v at program point d reaches program point u if there exists a path of control flow edges from d to u that does not contain a definition of v.

- Build up RD stmt by stmt
- Stmt s, "d: v <- x op y", generates d
- Stmt s, "d: v <- x op y", kills all other defs(v)
 Or,
- Gen[s] = { d }
- Kill[s] = defs(v) { d }

Gen and kill for each stmt

```
Gen
                                          kill
1: n <- 10
2: older <- 0
3: old <-1
                                           10
4: result <- 0
5: if n \le 1 goto 14
6: i <- 2
                                           11
                                   6
7: if i > n goto 13
8: result <- old + older
9: older <- old
10: old <- result
                                   10
                                           3
11: i < -i + 1
                                   11
12: JUMP 7
13: return result
14: return n
```

we determine the defs that reach a node by using:

- control flow information
- gen and kill info

Computing in[n] and out[n]

- In[n]: the set of defs that reach the beginning of node n
- Out[n]: the set of defs that reach the end of node n

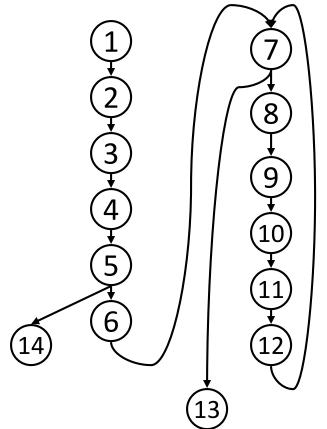
$$\mathsf{in[n]} = \bigcup_{p \in pred[n]} out[p]$$

$$out[n] = gen[n] \bigcup (in[n] - kill[n])$$

- Initialize in[n]=out[n]={} for all n
- Solve iteratively

pred[n]?

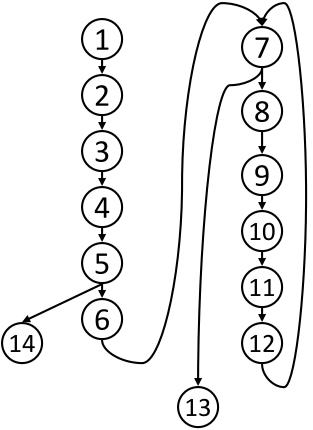
- Pred[n] are all nodes that can directly reach n in the control flow graph.
- E.g., pred[7] = { 6, 12 }



```
1:
      n < -10
2:
      older <- 0
3:
      old <- 1
4:
      result <- 0
5:
      if n <= 1 goto 14
6:
      i <- 2
7:
      if i > n goto 13
8:
      result <- old + older
9:
      older <- old
10:
      old <- result
11:
      i < -i + 1
12:
      JUMP 7
13:
      return result
14:
      return n
```

What order to eval nodes?

- Does it matter?
- Lets do: 1,2,3,4,5,14,6,7,13,8,9,10,11,12



```
1: n < -10
2: older <- 0
3: old <- 1
4: result <- 0
5:
     if n <= 1 goto 14
6:
      i <- 2
7:
      if i > n goto 13
8:
      result <- old + older
9: older <- old
10: old <- result
11: i \leftarrow i + 1
12:
      JUMP 7
13:
      return result
14:
      return n
```

Example:

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$ 1 1 1

2: older < -0 2 9

3: old < -1 3 10

4: result < -0 4 8

5: if $n <= 1$ goto 14

6: $i < -2$ 6 11

7: if $i > n$ goto 13

8: result $< -$ old $+$ older 8 4

9: older $< -$ old 9 2

10: old $< -$ result 10 3

11: $i < -i + 1$ 11 6

12: JUMP 7

13: return result

51

Example:

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

5: if $n < = 1$ goto 14

6: $i < -2$

7: if $i > n$ goto 13

8: result $< -$ old $+$ older

9: older $< -$ old

10: old $< -$ result

10: 3

11: $i < -i + 1$

12: JUMP 7

13: return result

Example:

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n \leftarrow 10$ 1 1 1
2: older $\leftarrow 0$ 2 9 1 1,2
3: old $\leftarrow 1$ 3 10 1,2 1,2,3
4: result $\leftarrow 0$ 4 8
5: if $n \leftarrow 1$ goto 14
6: $i \leftarrow 2$ 6 11
7: if $i > n$ goto 13
8: result $\leftarrow 0$ 8 4
9: older $\leftarrow 0$ 9 2
10: old $\leftarrow 0$ 10 3
11: $i \leftarrow i + 1$ 11 6
12: JUMP 7

53

13: return result

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

5: if $n < = 1$ goto 14

6: $i < -2$

7: if $i > n$ goto 13

8: result $< -$ old $+$ older

9: older $< -$ old

10: old $< -$ result

10: JUMP 7

13: return result

54

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

10: JUMP 7

13: return result

14: return n

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

10: $= 1$ old

11: i $< -$ i + 1

12: JUMP 7

13: return result

14: return $= 1$ out[n] = $= 1$ out[n] = $= 1$ out

10: old $= 1$ out

10: old $= 1$ out

11: old

12: JUMP 7

13: return result

14: return $= 1$

57

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

10: 3

11: i $< -$ i + 1

12: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

10: 3

11: i $< -$ i + 1

12: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

11: i $< -$ i + 1

12: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

1: i $< -$ i + 1

12: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

1: i $< -$ i + 1

12: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \cup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

1: i $< -$ i + 1

10: JUMP 7

13: return result

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

1-4,6

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

65

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \bigcup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

1: $1 < - i + 1$

1: $1 < - i + 1$

1: $1 < - i + 1$

1: return n

Out

1: $n < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i < - i$

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \bigcup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: $1 < -10$

1: 1

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

$$in[n] = \bigcup_{p \in pred[n]} out[p]$$
 $out[n] = gen[n] \bigcup (in[n] - kill[n])$

Gen kill in out

1: $n < -10$

2: older < -0

3: old < -1

4: result < -0

5: if $n < = 1$ goto 14

6: i < -2

7: if i > n goto 13

8: result $< -$ old + older

9: older $< -$ old

9: older $< -$ old

10: old $< -$ result

10: old $< -$ result

10: old $< -$ result

11: i $< -$ i + 1

12: JUMP 7

13: return result

14: return n

71

• Order: 1,2,3,4,5,14,6,7,13,8,9,10,11,12

72

An Improvement: Basic Blocks

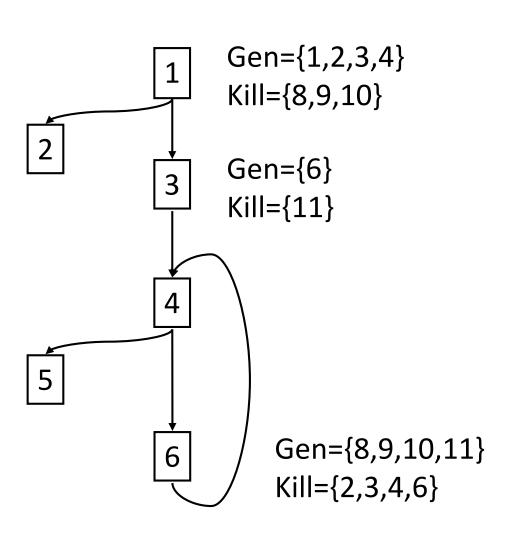
- No need to compute this one stmt at a time
- For straight line code:
 - ln[s1; s2] = in[s1]
 - Out[s1; s2] = out[s2]
- Combine the gen and kill sets into one per BB.

					Gen	kill
•	$Gen[BB]=\{2,3,4,5\}$	1:	i <-	1	1	8,4
			j <-		2	
•	Kill[BB]={1,8,11}	3:	k <-	3 + i	3	11
		4:	i <-	j	4	1,8
		5:	m <-	i + k	5	

BB sets

		Gen	kill		
_	1: n <- 10	1			
	2: older <- 0	2	9		
1	3: old <- 1	3	10		
	4: result <- 0	4	8		
	5: if n <= 1 goto 14			1,2,3,4	8,9,10
3	6: i <- 2	6	11	6	11
4	7: if i > n goto 13				
	8: result <- old + older	8	4		
	9: older <- old	9	2		
6	10: old <- result	10	3		
	11: i <- i + 1	11	6		
	12: JUMP 7			8-11	2-4,6
₂ 5	13: return result				
2 -	14: return n				

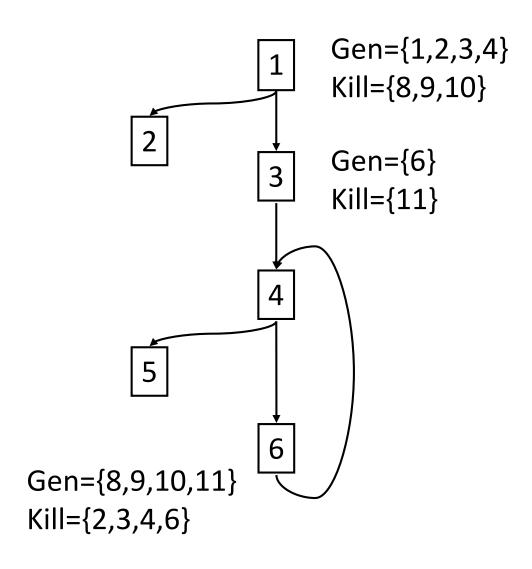
BB sets



In out

1,2,3,4

BB sets



In out

1,2,3,4

1,2,3,4

1,2,3,4,6

1-4,6,8-11 1-4,6,8-11

1-4,6,8-11

1,8-11

Forward Dataflow

Reaching definitions is a forward dataflow problem:
 It propagates information from the predecessors of a node to the node

Defined by:

- Basic attributes: (gen and kill)
- Transfer function: F_{bb} $out[n] = gen[n] \bigcup (in[n] kill[n])$
- Meet operator: union $in[n] = \bigcup_{p \in pred[n]} out[p]$
- Set of values (a lattice, in this case powerset of program points)
- Initial values for each node b
- Solve for fixed point solution

How to implement?

- Values?
- Gen?
- Kill?
- F_{bb}?
- Order to visit nodes?
- When are we done?
 - In fact, do we know we terminate?

Implementing RD

- Values: bits in a bit vector
- Gen: 1 in each position generated, otherwise 0
- Kill: 0 in each position killed, otherwise 1
- F_{bb}: out[b] = gen[b] | (in[b] & kill[b])
- Init in[b]=out[b]=0

- When are we done?
- What order to visit nodes? Does it matter?

RD Worklist algorithm

```
Initialize: in[B] = out[b] = \emptyset
Initialize: in[entry] = \emptyset
Work queue, W = all Blocks in topological order
while (|W| != 0) {
   remove b from W
   old = out[b]
   in[b] = \{over all pred(p) \in b\} \cup out[p]
   out[b] = gen[b] \cup (in[b] - kill[b])
   if (old != out[b]) W = W \cup succ(b)
```

Storing Rd information

 Use-def chains: for each use of var x in s, a list of definitions of x that reach s

```
n < -10
2: older <- 0
                                      1,2
3: old <- 1
                                      1,2,3
                           1,2
4: result <- 0
                           1-3
                                      1 - 4
5: if h <= 1 goto 14
                           1-4
                                      1-4
6: i <- 2
                           1-4 1-4,6
7: if /i > n goto 13
                           1-4,6,8-11 1-4,6,8-11
8: result <- old + older
                           1-4,6,8-11 1-3,6,8-11
9: older <- old -
                           1-3,6,8-11 1,3,6,8-11
10: dd <- result
                           1,3,6,8-11 1,6,8-11
11: i < -i + 1
                           1,6,8-11 1,8-11
12: JUMP 7
                           1,8-11 1,8-11
13: return result
                           1-4,6
                           1-4
                                      1-4
14: return n
```

82

Constant Folding + DCE

-1: n <- 10	1	
1. 11 <- 10	_	
2: older <- 0	1	1,2
3: old <- 1	1,2	1,2,3
4: result <- 0	1-3	1-4
- 5: if 10 <= 1 goto 14	1-4	1-4
6: i <- 2	1-4	1-4,6
7: if i > 10 goto 13	1-4,6,8-11	1-4,6,8-11
8: result <- old + older	1-4,6,8-11	1-3,6,8-11
9: older <- old	1-3,6,8-11	1,3,6,8-11
10: old <- result	1,3,6,8-11	1,6,8-11
11: i <- i + 1	1,6,8-11	1,8-11
12: JUMP 7	1,8-11	1,8-11
13: return result	1-4,6	1-4,6
14: return 10	1-4	1-4

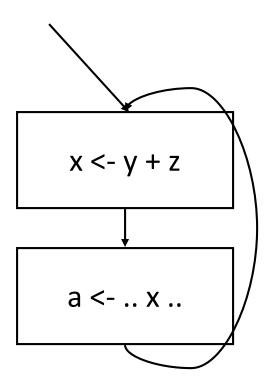
Better Constant Propagation

What about:

 We saw this in conditional constant propagation using SSA

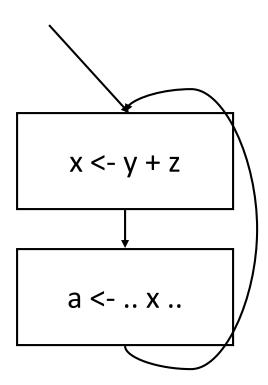
Loop Invariant Code Motion

 When can expression be moved out of a loop?



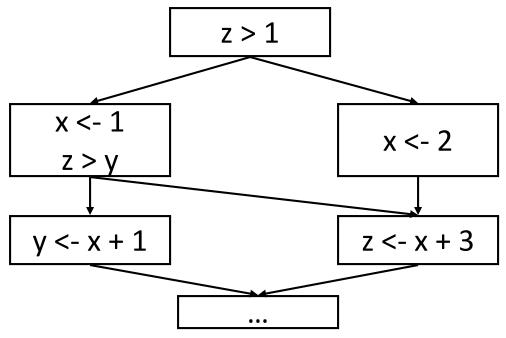
Loop Invariant Code Motion

- When can expression be moved out of a loop?
- When all reaching definitions of operands are outside of loop, expression is loop invariant
- Use ud-chains to detect



Def-use chains are valuable too

- Def-use chain: for each definition of var x, a list of all uses of that definition
- Computed from liveness analysis, a backward dataflow problem
- Def-use is NOT symmetric to use-def



15-411/611 © 2019-20 Goldstein

Liveness (def-use chains)

 A variable x is live-out of a stmt s if x can be used along some path starting a s, otherwise x is dead.

Liveness as a dataflow problem

- This is a backwards analysis
 - A variable is live out if used by a successor
 - Gen: For a use: indicate it is live coming into s
 - Kill: Defining a variable v in s makes it dead before s (unless s uses v to define v)
 - Lattice is just live (top) and dead (bottom)
- Values are variables
- In[n] = variables live before n = $(out[n]-kill[n]) \cup gen[n]$
- Out[n] = variables live after n= \int_In[s]

 $S \in SUCC(n)$ © 2019-20 Goldstein

Dead Code Elimination

- Code is dead if it has no effect on the outcome of the program.
- When is code dead?

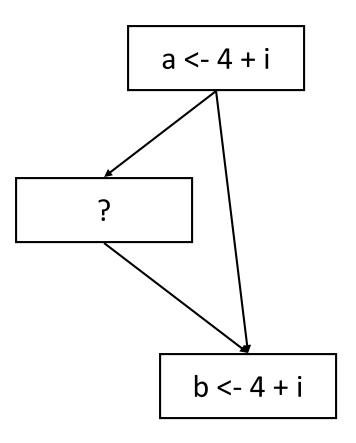
Dead Code Elimination

- Code is dead if it has no effect on the outcome of the program.
- When is code dead?
 - When the definition is dead, and
 - When the instruction has no side effects

So:

- run liveness
- Construct def-use chains
- Any instruction which has no users and has no side effects can be eliminated

When can we do CSE?



92

Available Expressions

- X+Y is "available" at statement S if
 - x+y is computed along every path from the start to S
 AND
 - neither x nor y is modified after the last evaluation of x+y

Available Expressions

- X+Y is "available" at statement S if
 - x+y is computed along every path from the start to S
 AND
 - neither x nor y is modified after the last evaluation of x+y

Computing Available Expressions

- Forward or backward?
- Values?
- Lattice?
- gen[b] =
- kill[b] =
- in[b] =
- out[b] =
- initialization?

Computing Available Expressions

- Forward
- Values: all expressions
- Lattice: available, not-avail
- gen[b] = if b evals expr e and doesn't
 define variables used in e
- kill[b] = if b assigns to x,
 then all exprs using x are killed.
- out[b] = (in[b] − kill[b]) ∪ gen[b]
- in[b] = what to do at a join point?
- initialization?

Computing Available Expressions

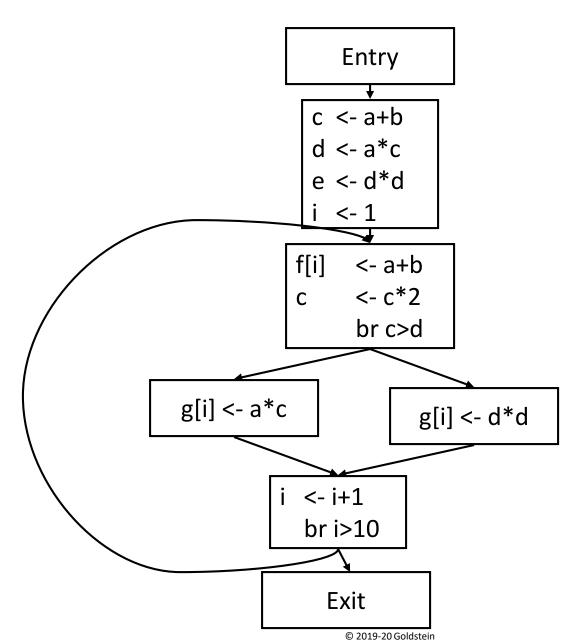
- Forward
- Values: all expressions
- Lattice: available, not-avail
- gen[b] = if b evals expr e and doesn't
 define variables used in e
- kill[b] = if b assigns to x, exprs(x) are killed out[b] = (in[b] - kill[b]) ∪ gen[b]
- in[b] = An expr is avail only if avail on ALL edges, so:
 in[b] = ∩ over all p∈ pred(b), out[p]
- Initialization
 - All nodes, but entry are set to ALL avail
 - Entry is set to NONE avail

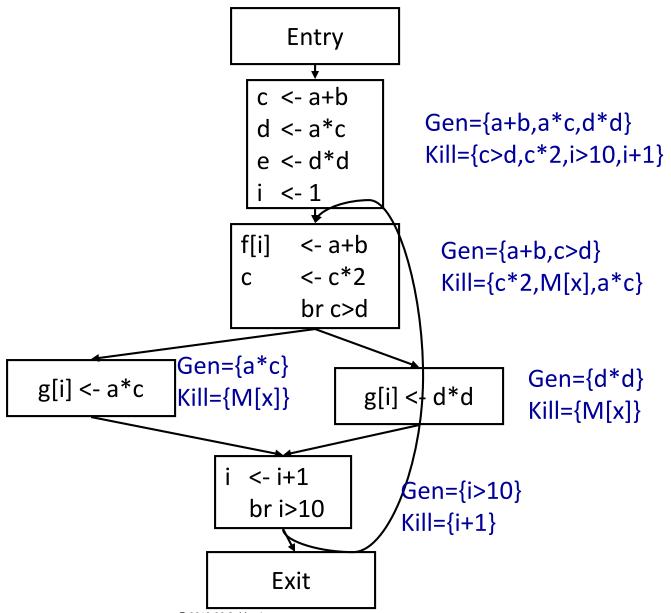
Constructing Gen & Kill

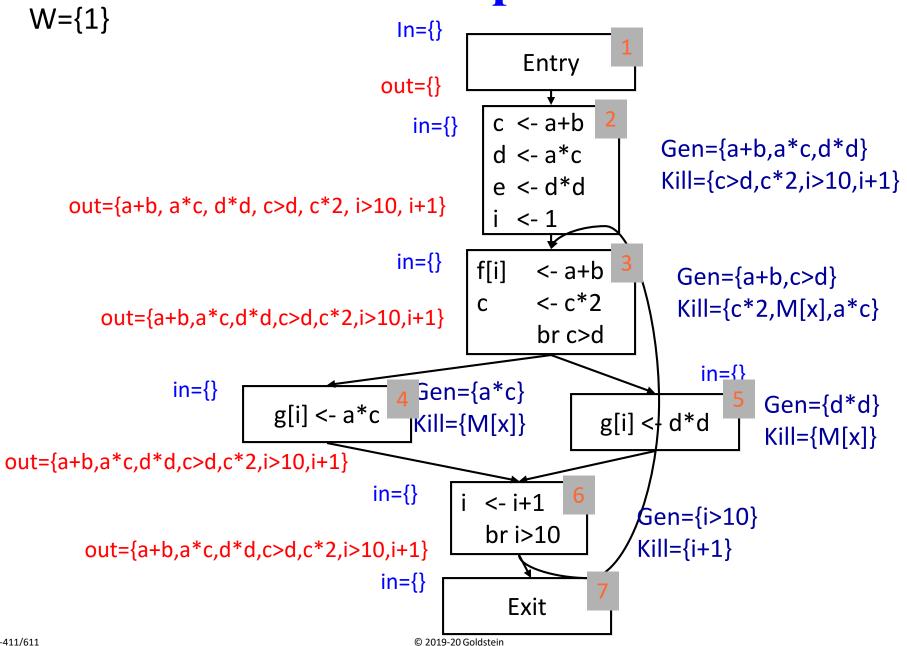
Stmt s	Gen	Kill
t <- x op y	{x op y}-kill[s]	{exprs containing t}
t <- M[a]	{M[a]}-kill[s]	
M[a] <- b		
f(a,)		{M[x] for all x}
t <- f(a,)		

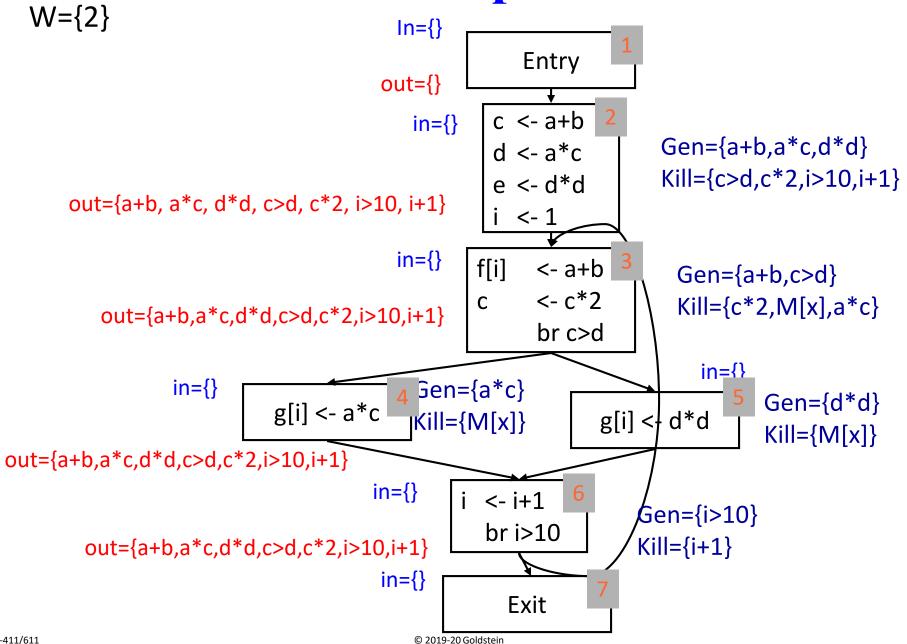
Constructing Gen & Kill

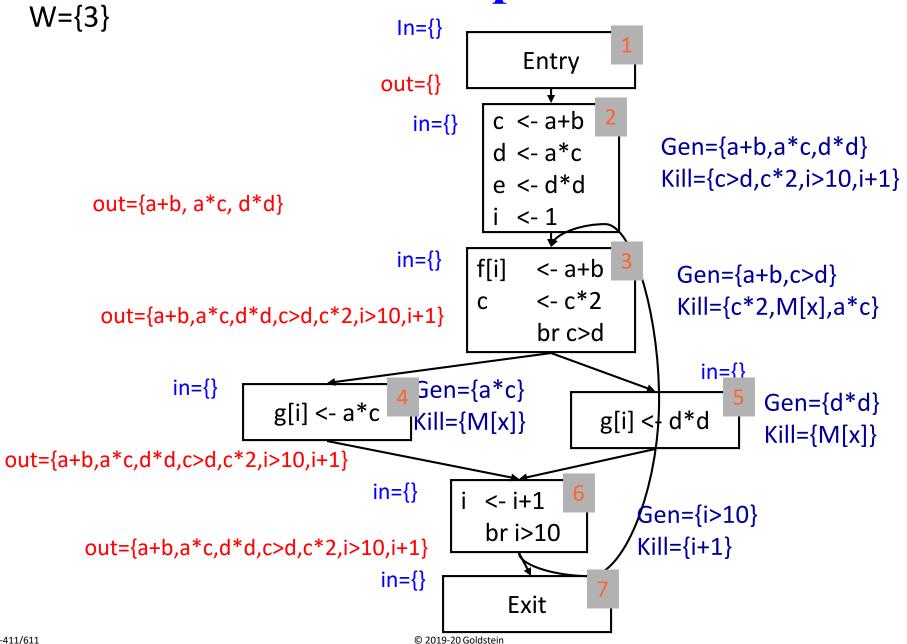
Stmt s	Gen	Kill
t <- x op y	{x op y}-kill[s]	{exprs containing t}
t <- M[a]	{M[a]}-kill[s]	{exprs containing t}
M[a] <- b	{}	{for all x, M[x]}
f(a,)	{}	{for all x, M[x]}
t <- f(a,)	{}	{exprs containing t
		for all x, M[x]}

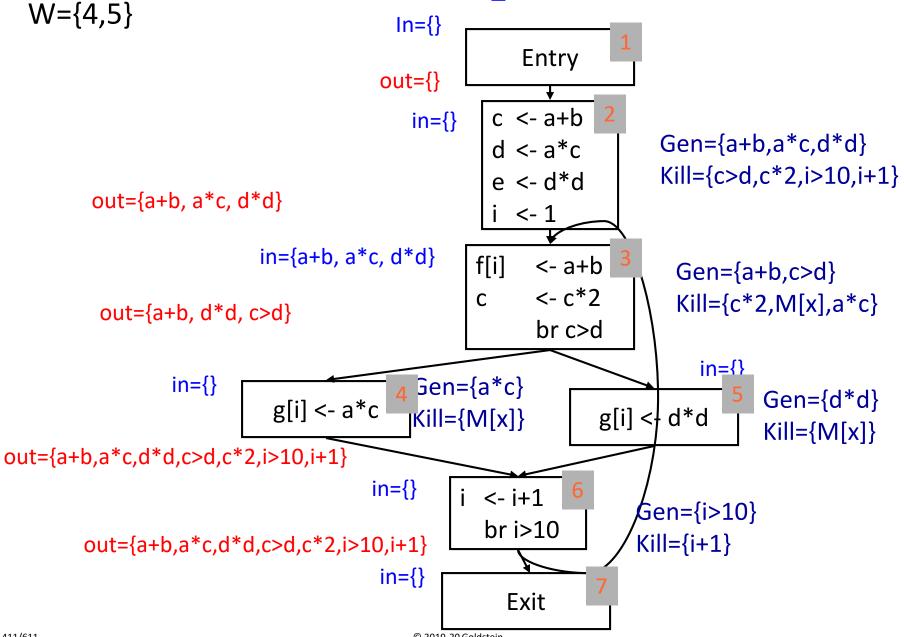




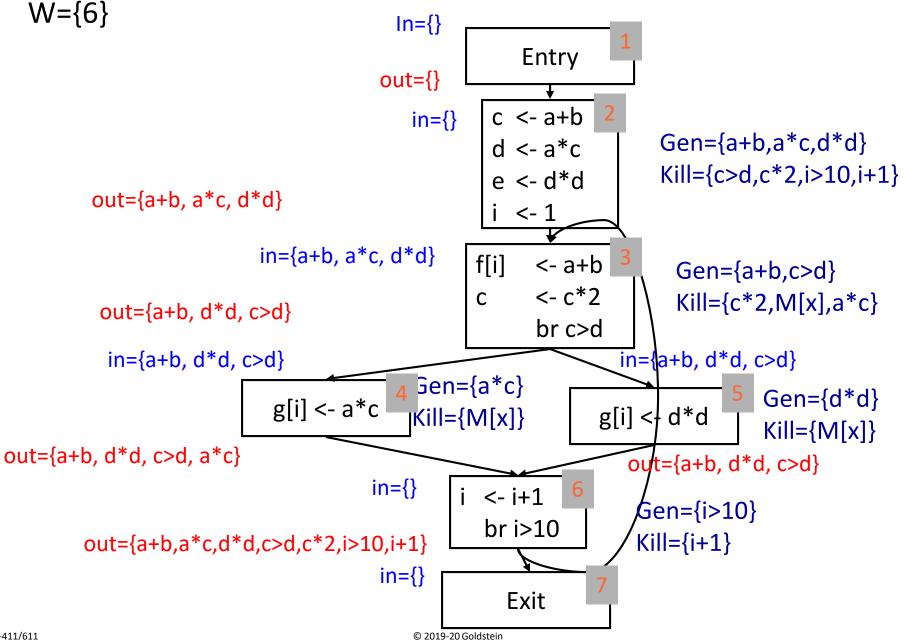


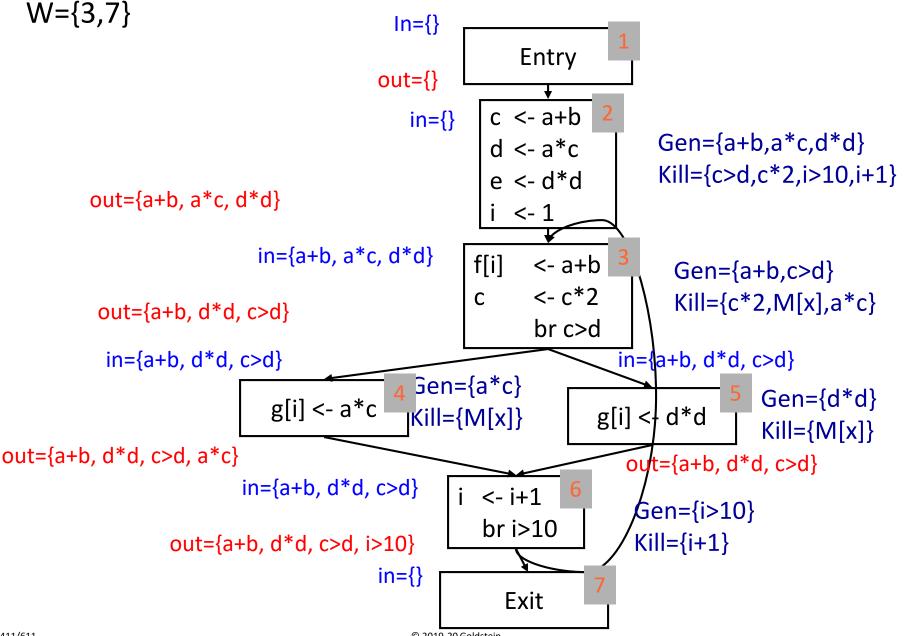




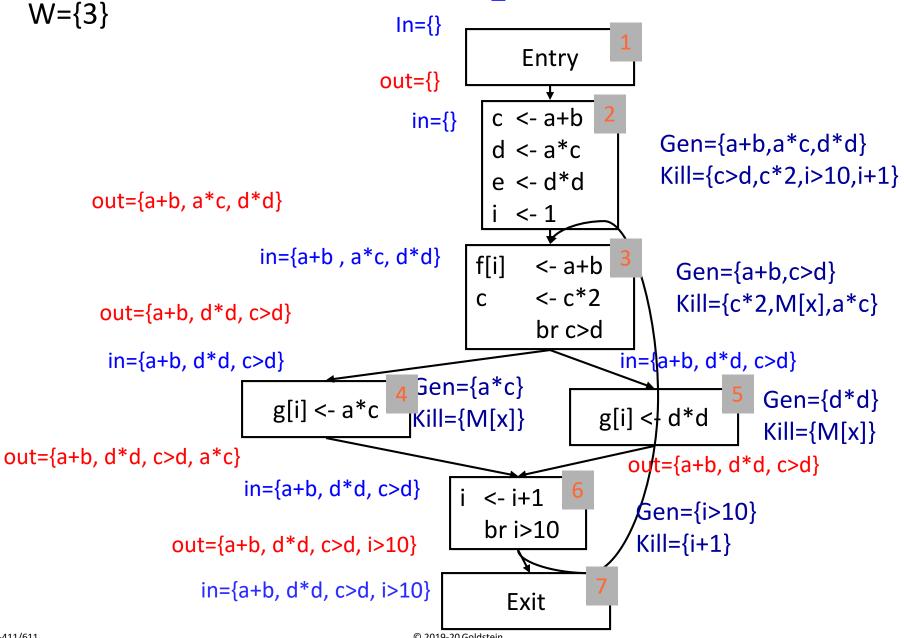


15-411/611 © 2019-20 Goldstein 105

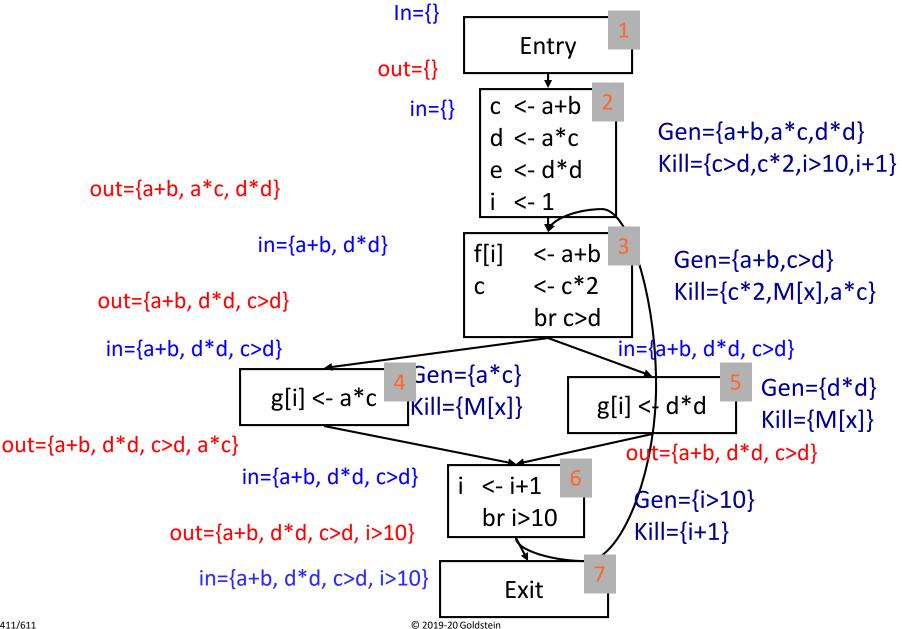




15-411/611 © 2019-20 Goldstein 107



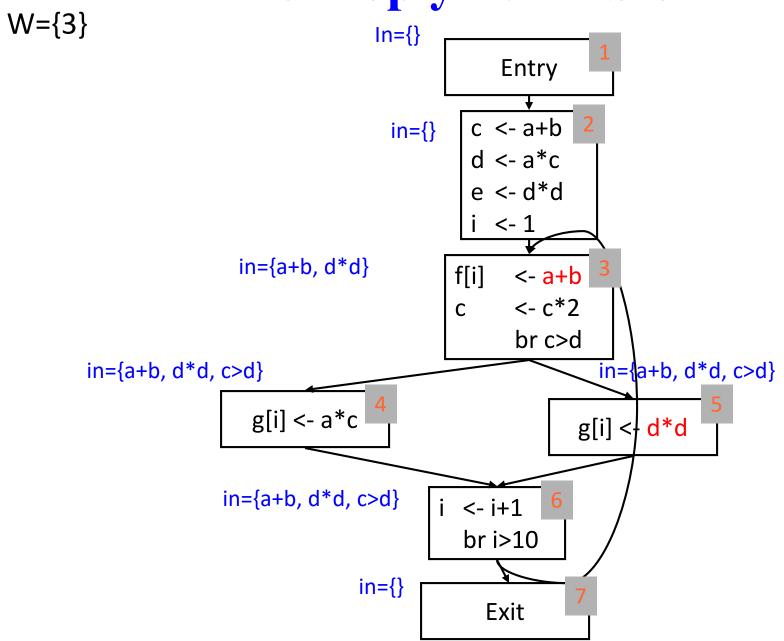
© 2019-20 Goldstein 108 15-411/611



CSE

- Calculate Available expressions
- For every stmt in program If expression, x op y, is available { Compute reaching expressions for "x op y" at this stmt foreach stmt in RE of the form t <- x op y rewrite at: t' <- x op y t <- t' replace "x op y" in stmt with t'

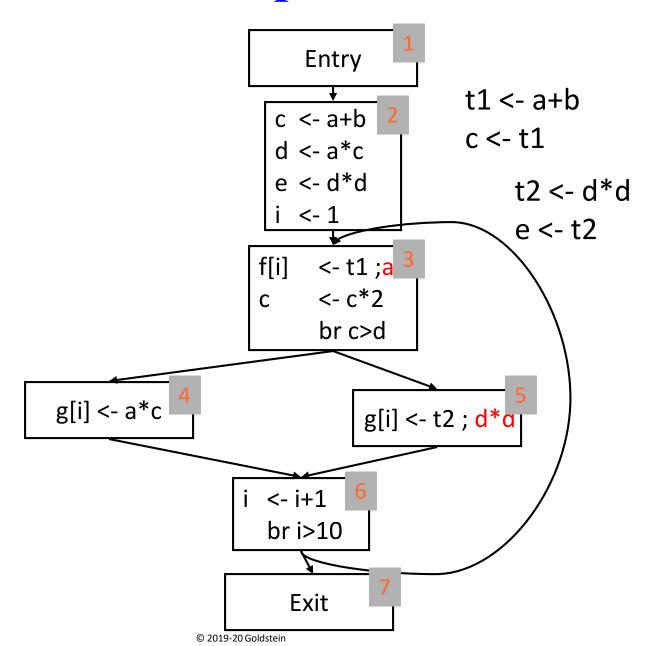
Find x op y available



© 2019-20 Goldstein

Calculating Reaching Expressions

- Could be dataflow problem, but not needed enough, so ...
- To find RE for "x op y" at stmt S
 - traverse cfg backward from S until
 - reach t <- x + y(& put into RE)
 - reach definition of x or y



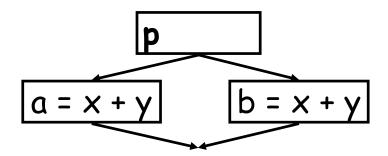
Dataflow Summary

	Union (may)	intersection (must)
Forward	Reaching defs	Available exprs
Backward	Live variables	very busy exprs

Later in course we look at bidirectional dataflow

Very Busy Expressions

- A Backward, Must data flow analysis
- An expression e is very busy at point p if On every path from p, e is evaluated before the value of e is changed
- Optimization
 - Can hoist very busy expression computation



Forward Must Data Flow Algorithm

```
Out(s) = Gen(s) for all statements s
W = {all statements}
Repeat
       Take s from W
       In(s) = \bigcap_{s' \in pred(s)} Out(s')
       Temp = Gen(s) \cup (In(s) – Kill(s))
       If (temp != Out(s)) {
               Out(s) = temp
              W = W \cup succ(s)
Until W = \emptyset
```

Forward May Data Flow Algorithm

```
Out(s) = Gen(s) for all statements s
W = {all statements}
Repeat
       Take s from W
       In(s) = \bigcup_{s' \in pred(s)} Out(s')
       Temp = Gen(s) \cup (In(s) – Kill(s))
       If (temp != Out(s)) {
               Out(s) = temp
              W = W \cup succ(s)
Until W = \emptyset
```

Backward May Data Flow Algorithm

```
In(s) = Gen(s) for all statements s
W = {all statements} (worklist)
Repeat
       Take s from W
       Out(s) = \bigcup_{s' \in \text{succ(s)}} \text{In(s')}
       Temp = Gen(s) \cup (Out(s) – Kill(s))
       If (temp != In(s)) 
               In(s) = temp
               W = W \cup pred(s)
Until W = \emptyset
```

Backward Must Data Flow Algorithm

```
In(s) = Gen(s) for all statements s
W = {all statements} (worklist)
Repeat
       Take s from W
       Out(s) = \bigcap_{s' \in \text{succ(s)}} \text{In(s')}
       Temp = Gen(s) \cup (Out(s) – Kill(s))
        If (temp != In(s)) {
               In(s) = temp
               W = W \cup pred(s)
Until W = \emptyset
```

From Basic Blocks to Program Points

Dataflow Framework

- Universe of values forms a lattics
- Meet operator used at join points in CFG
- Basic attributes (e.g., gen, kill)
- Traversal order
- Transfer function

- Will it terminate?
- Is it efficient?
- Is it accurate?