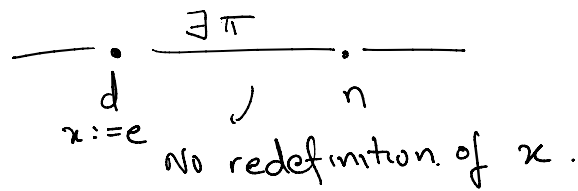


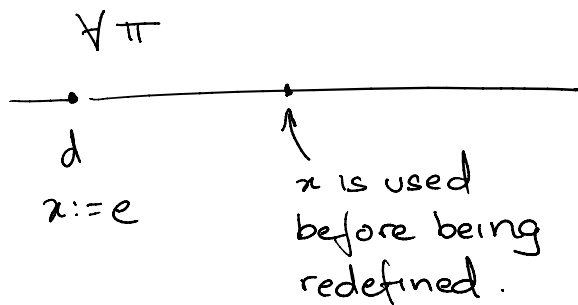
- Hello!
- Please turn in Assignment 2 by April 15.
- Do: Blindly apply Tseitin's transform for Q2.

- Chaotic iteration algorithm to compute reaching definitions  
 Compute-RD

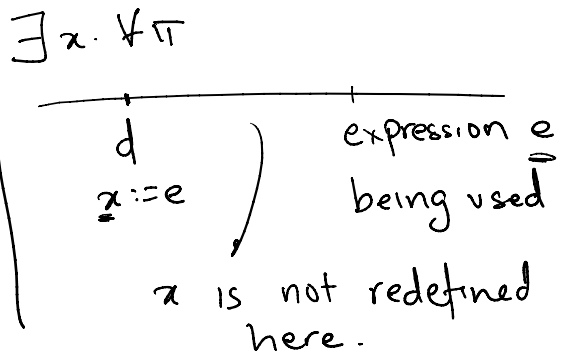
- Relatives of reaching definitions



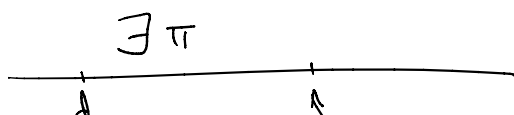
Very busy expressions

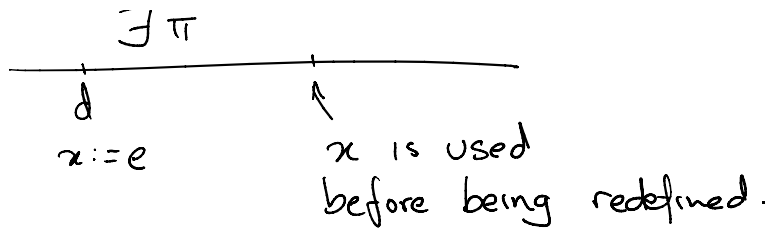


Available expressions



Live Variable (Useful in dead code elimination)





## Elementary observations about RD

Claim (Lower bounds on  $IN$  &  $OUT$ )

②'  $\forall i^n \text{ OUT}[n_i] \subseteq \text{IN}[n_i]$

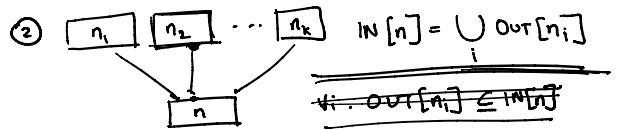
$\forall i^n, d \in \text{OUT}[n_i] \Rightarrow d \in \text{IN}[n_i]$

③  $\forall n, (\text{IN}[n] \setminus \text{KILL}[n]) \cup \text{GEN}[n] \subseteq \text{OUT}[n]$

④'  $\forall n, d, d \in \text{IN}[n] \setminus \text{KILL}[n] \Rightarrow d \in \text{OUT}[n]$

$\forall n, d, d \in \text{GEN}[n] \Rightarrow d \in \text{OUT}[n]$

claim: ①  $\text{OUT}[\text{Entry}] = \emptyset$



③  $n: x := e \quad \text{OUT}[n] = (\text{IN}[n] \setminus \text{KILL}[n]) \cup \text{GEN}[n]$

Every dataflow fact involving  $x$

The statement  $x := e \rightarrow \text{KILL}[n] = \{d \mid d: x := e\}$

④  $n: \begin{matrix} \text{I} \\ \text{b?} \\ \text{Y} \end{matrix} \quad \text{OUT}[n] = (\text{IN}[n] \setminus \text{KILL}[n]) \cup \text{GEN}[n]$

Conditional statements don't kill any facts; don't give rise to any dataflow facts.

$\text{KILL}[n] = \emptyset$   
 $\text{GEN}[n] = \emptyset$

System of constraints, very similar to a system of linear equations.

- Q1. Does it admit a solution?
- Q2. Does it admit a unique solution?
- Q3. How are these solutions related to each other?

... find the trivial solution

✓

- Admits at least the trivial solution

$\forall n. IN[n] = OUT[n] = \{ \text{all assignment statements } d \}$

- Compute-RD also produces a solution.

---

Thm:  $\vec{a}$  is a solution,  $\vec{b}$  is a solution to a system of linear equations,  $A\vec{x} = \vec{0}$

then  $\forall \alpha, \beta \in \mathbb{R}, \alpha\vec{a} + \beta\vec{b}$  is also a solution.

---

Prop: If  $(IN[n_1], IN[n_2], \dots, IN[n_k],$   
 $OUT[n_1], OUT[n_2], \dots, OUT[n_k])$  is a solution to

②' ③' ④'

∧ if  $(IN'[n_1], IN'[n_2], \dots, IN'[n_k],$   
 $OUT'[n_1], OUT'[n_2], \dots, OUT'[n_k])$  is also a solution,

Conj 1:  $(IN[n_1] \cup IN'[n_1], IN[n_2] \cup IN'[n_2], \dots, IN[n_k] \cup IN'[n_k],$   
 $OUT[n_1] \cup OUT'[n_1], OUT[n_2] \cup OUT'[n_2], \dots, OUT[n_k] \cup OUT'[n_k])$   
is also a solution.

Conj 2:  $(IN[n_1] \cap IN'[n_1], IN[n_2] \cap IN'[n_2], \dots, IN[n_k] \cap IN'[n_k],$   
 $OUT[n_1] \cap OUT'[n_1], OUT[n_2] \cap OUT'[n_2], \dots, OUT[n_k] \cap OUT'[n_k])$

$OUT[n_1] \cap OUT'[n_1], OUT[n_2] \cap OUT'[n_2], \dots, OUT[n_k] \cap OUT'[n_k]$   
is also a solution.

---

Proof of conj 1: If  $(IN, OUT)$  satisfies  $\textcircled{2'}$   $\textcircled{3'}$   $\textcircled{4'}$

$(IN', OUT')$  satisfies  $\textcircled{2'}$   $\textcircled{3'}$   $\textcircled{4'}$

then  $(IN \cup IN', OUT \cup OUT')$  also satisfies  $\textcircled{2'}$   $\textcircled{3'}$   $\textcircled{4'}$

Proof  $\textcircled{2'}$ :  $\forall n_i \cap d$  s.t.  $n_i$  is an immediate predecessor  
of  $n$

If  $d \in \textcircled{OUT[n_i]} \cup \textcircled{OUT'[n_i]}$  then  $d \in \textcircled{IN[n]} \cup \textcircled{IN'[n]}$ .

Case 1:  $d \in \textcircled{OUT[n_i]} \Rightarrow d \in \textcircled{IN[n]}$  by hypothesis

Case 2:  $d \in \textcircled{OUT'[n_i]} \Rightarrow$  \_\_\_\_\_

Proofs of  $\textcircled{3'}$ ,  $\textcircled{4'}$ : Similar.

---

Proof of conj 2: If  $(IN, OUT)$  both satisfy  $\textcircled{2'}$   $\textcircled{3'}$   $\textcircled{4'}$   
 $(IN', OUT')$

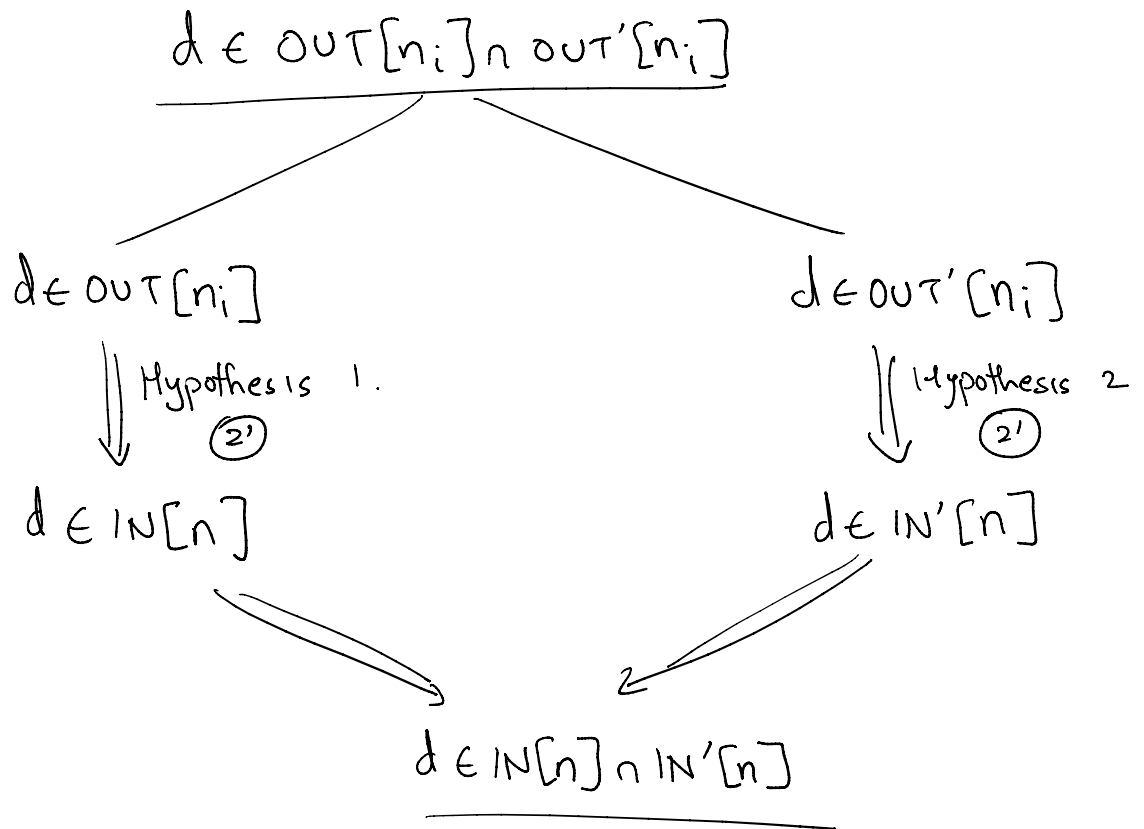
then  $(IN \cap IN', OUT \cap OUT')$  also satisfies  $\textcircled{2'}$   $\textcircled{3'}$   $\textcircled{4'}$ .

Proof of  $\textcircled{2'}$ :  $\forall n_i \cap d$  if  $n_i$  is an imm. pred. of  $n$

if  $d \in \textcircled{OUT[n]} \cap \textcircled{OUT'[n]} \Rightarrow d \in \textcircled{IN[n]} \cap \textcircled{IN'[n]}$

0 0 0

then  $d \in \text{OUT}[n_i] \cap \text{OUT}'[n_i] \Rightarrow d \in \text{IN}[n] \cap \text{IN}'[n]$ .



Prop:  $\text{Compute-RD}(P) = \bigcap_{\text{all solutions } (IN, OUT)} (IN, OUT)$

↑  
program

In other words,  $\text{compute-RD}$  produces the smallest soln to ②' ③' ④'.

Algorithm Compute-RD (Chaotic Iteration Algorithm)

① For each statement  $n$ ,

Invariant: Always

$\in (IN, OUT)$

① For each statement  $n$ ,  
 initialize  $IN[n], OUT[n] := \emptyset$ .

Invariant: Always

$$\underbrace{(IN, OUT)}_{\text{Compute-ED}} \subseteq \underbrace{(IN, OUT)}_{\text{every sol'n.}}$$

② Until fixpoint: (Iter  $\neq k$ )

For each non-entry stmt  $n$ :

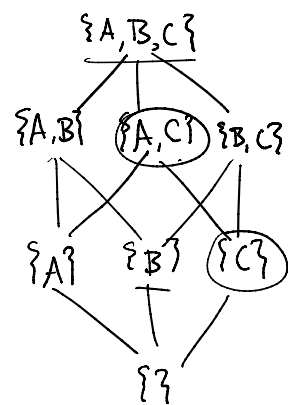
- Update  $IN[n] := \bigcup_i OUT[n_i]$   
 $i$  ← ranging over all predecessors

- Update  $OUT[n] := (IN[n] \setminus KILL[n]) \cup GEN[n]$

Specified as part of the input;  
 Computed at the beginning of time.

Mathematically speaking,

the solutions to ②' ③' ④' form a lattice.



Claim (Lower bounds on  $IN$  &  $OUT$ )

②'  $\forall i \quad OUT[n_i] \subseteq IN[n]$

$\forall i \quad d, d \in OUT[n_i] \Rightarrow d \in \boxed{IN[n]}$

$\forall n \quad n_i \quad d$

$IN(n, d) := OUT(n_i, d), \text{pred}(n_i, n)$

$$\forall i, d, d \in \text{OUT}[n_i] \Rightarrow d \in \text{IN}[n]$$

$$\text{IN}(n, d) :- \text{OUT}(n_i, d), \text{pred}(n_i, n)$$

$$\textcircled{3} \forall n, (\text{IN}[n] \setminus \text{KILL}[n]) \cup \text{GEN}[n] \subseteq \text{OUT}[n]$$

④

$$\forall n, d, d \in \text{IN}[n] \setminus \text{KILL}[n] \Rightarrow d \in \text{OUT}[n] \checkmark$$

$$\forall n, d, d \in \text{GEN}[n] \Rightarrow d \in \text{OUT}[n]$$

$$\forall n, d \text{ OUT}(n, d) :- \text{IN}(n, d), !\text{KILL}(n, d)$$

$\forall n$

$$\text{OUT}(n, d) :- \text{GEN}(n, d)$$

Datalog

$$\forall n, n_i, d$$

$$\text{IN}(n, d) :- \text{OUT}(n_i, d), \text{pred}(n_i, n)$$

$$\forall n, d \text{ OUT}(n, d) :- \text{IN}(n, d), !\text{KILL}(n, d)$$

$$\forall n$$

$$\text{OUT}(n, d) :- \text{GEN}(n, d)$$

output relation

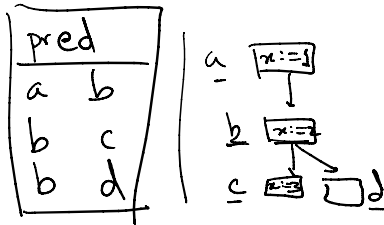
IN	OUT
⋮	⋮
⋮	⋮
⋮	⋮

KILL

b	a
c	b
c	b
⋮	⋮

GEN

a	a
b	b
c	c
⋮	⋮



Program

Control-flow graph

Datalog evaluator

Data-flow facts

Datalog solver produces the least solution to the set of rules.

set of rules.

$IN(n, d) :- OUT(n_i, d) \text{ pred}(n_i, n)$

"For all CFG nodes  $n_i, n,$

for all assignment statements  $d$

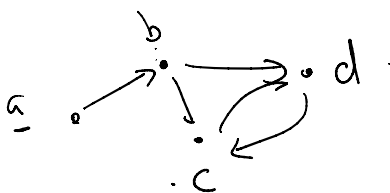
if  $(n_i, d) \in OUT$  ( $d \in OUT[n_i]$ )

& if  $(n_i, n) \in \text{pred}$  ( $\begin{matrix} n_i \\ \downarrow \\ n \end{matrix}$  in CFG)

then  $(n, d) \in IN$  ( $d \in IN[n]$ )." 

---

Ex: Reachability in graphs.



edge  $\leftarrow$  Adjacency relation

a	b
b	d
b	c
c	d
d	c

Input table

Input relation

To compute: path (Output relation)

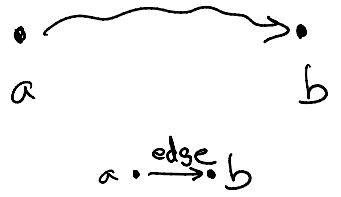
s.t.  $(a, b) \in \text{path}$  iff there is a path from  $a$  to  $b$ .

$\xrightarrow{R_i}$  path  $(a, b) :- \text{edge}(a, b).$

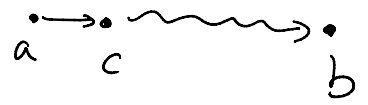


R<sub>1</sub> path (a, b) :- edge(a, b).

R<sub>2</sub> path (a, b) :- edge(a, c), path(c, b).



To compute: strongly connected components



(a, b) ∈ scc iff a, b are in the same scc.

R<sub>3</sub> scc(a, b) :- path(a, b), path(b, a).

---

Programmer doesn't worry about

- ① Order of computation.
- ② Order of loops
- ③ Optimizations
- ④ Parallelism
- ⑤ Provenance tracking

Rule R<sub>1</sub> (imperative)

∀ (a, b) ∈ edge

path := path ∪ {(a, b)}

Rule R<sub>2</sub> (imperative)

R2 path (a, b) := edge(a, c), path(c, b).

for all (a, c) ∈ edge : for all vertices b :

if (c, b) ∈ path :

path := path ∪ {(a, b)}

Problem : We are redefining path in the middle of the loop.

forall (a, c) ∈ edge  
newPaths := ∅  
forall vertices b, if (c, b) ∈ path :  
newPaths := newPaths ∪ {(a, b)}  
paths := paths ∪ newPaths.

Problem : Inner loop is wasting time.

forall (a, c) ∈ edge  
np := ∅  
forall paths (d, b) where c = d  
np := np ∪ {(a, b)}  
p := p ∪ np.

Problem: How to index these sets?

How to parallelize?

How to compute provenance?

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- Souffle (open-source, started life in Oracle labs)
- Logic Blox (commercial)
- Graph QL (graph query languages)
- Semmle (static analysis. Acquired by GitHub.  
Microsoft)