

Static Program Analysis

Part 9 – pointer analysis

<http://cs.au.dk/~amoeller/spa/>

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Agenda

- **Introduction to points-to analysis**
- Andersen's analysis
- Steensgaard's analysis
- Interprocedural points-to analysis
- Null pointer analysis
- Flow-sensitive points-to analysis

Analyzing programs with pointers

How do we perform e.g.
constant propagation analysis
when the programming language
has pointers?
(or object references?)

```
...  
*x = 42;  
*y = -87;  
z = *x;  
// is z 42 or -87?
```

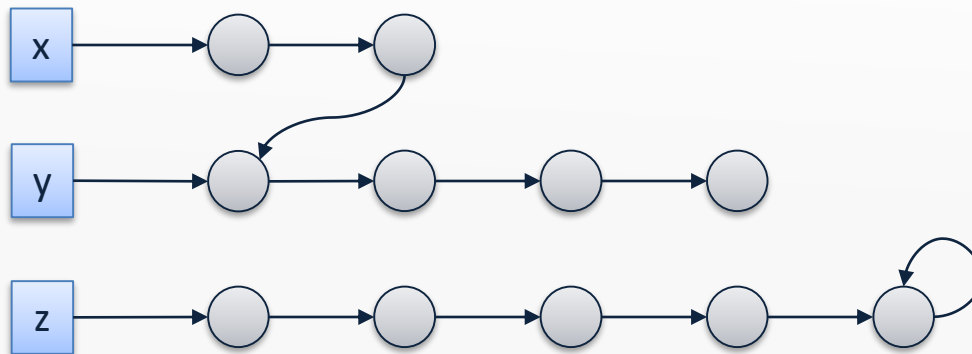
```
 $E \rightarrow \&X$   
|  $\text{alloc } E$   
|  $*E$   
|  $\text{null}$   
| ...
```

```
 $S \rightarrow *X = E;$   
| ...
```

```
 $E \rightarrow E(E, \dots, E)$ 
```

Heap pointers

- For simplicity, we ignore records
 - a 11oc then only allocates a single cell
 - only linear structures can be built in the heap



- Let's at first also ignore function pointers
- We still have many interesting analysis challenges...

Pointer targets

- The fundamental question about pointers:
What locations can they point to?
- We need a suitable abstraction
- The set of (abstract) cells, *Cells*, contains
 - \perp for each allocation site with index i
 - X for each program variable named X
- This is called ***allocation site abstraction***
- The set of all (abstract) locations, *Locs*, contains $\&p$ for every cell p
- Each abstract cell may correspond to many concrete memory cells at runtime

Points-to analysis

- Determine for each pointer variable X the set $pt(x)$ of the cells X may point to
- A *conservative* (“may points-to”) analysis:
 - the set may be too large
 - can show absence of aliasing: $pt(X) \cap pt(Y) = \emptyset$
- We’ll focus on *flow-insensitive* analyses:
 - take place on the AST
 - before or together with the control-flow analysis

```
...
*x = 42;
*y = -87;
z = *x;
// is z 42 or -87?
```

Obtaining points-to information

- An almost-trivial analysis (called *address-taken*):
 - include all $\text{alloc-}i$ cells
 - Include the X cell if the expression $\&X$ occurs in the program
- Improvement for a typed language:
 - eliminate those cells whose types do not match
- This is sometimes good enough
 - and clearly very fast to compute

Pointer normalization

- Assume that all pointer usage is normalized:
 - $X = \text{alloc } P$ where P is `null` or an integer constant
 - $X = \&Y$
 - $X = Y$
 - $X = *Y$
 - $*X = Y$
 - $X = \text{null}$
- Simply introduce lots of temporary variables...
- All sub-expressions are now named
- We choose to ignore the fact that the cells created at variable declarations and `allocs` are uninitialized

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Andersen's analysis (1/2)

- For every cell c , introduce a constraint variable $\llbracket c \rrbracket$ ranging over sets of locations, i.e. $\llbracket \cdot \rrbracket: Cells \rightarrow 2^{Locs}$
- Generate constraints:
 - $X = \text{alloc } P:$ $\&\text{alloc-}i \in \llbracket X \rrbracket$
 - $X = \&Y:$ $\&Y \in \llbracket X \rrbracket$
 - $X = Y:$ $\llbracket Y \rrbracket \subseteq \llbracket X \rrbracket$
 - $X = *Y:$ $\&\alpha \in \llbracket Y \rrbracket \Rightarrow \llbracket \alpha \rrbracket \subseteq \llbracket X \rrbracket$
 - $*X = Y:$ $\&\alpha \in \llbracket X \rrbracket \Rightarrow \llbracket Y \rrbracket \subseteq \llbracket \alpha \rrbracket$
 - $X = \text{null}:$ (no constraints)

Andersen's analysis (2/2)

- The points-to map is defined as:

$$pt(X) = \{ \alpha \in Cells \mid \&\alpha \in \llbracket X \rrbracket \}$$

- The constraints fit into the cubic framework 😊
- Unique minimal solution in time $O(n^3)$
- In practice, for Java: $O(n^2)$
- The analysis is flow-insensitive but *directional*
 - models the direction of the flow of values in assignments

Example program

```
var p,q,x,y,z;  
p = alloc null;  
x = y;  
x = z;  
*p = z;  
p = q;  
q = &y;  
x = *p;  
p = &z;
```

Applying Andersen

- Generated constraints:

```
&alloc-1 ∈ [[p]]  
[[y]] ⊆ [[x]]  
[[z]] ⊆ [[x]]  
&α ∈ [[p]] ⇒ [[z]] ⊆ [[α]]  
[[q]] ⊆ [[p]]  
&y ∈ [[q]]  
&α ∈ [[p]] ⇒ [[α]] ⊆ [[x]]  
&z ∈ [[p]]
```

- Smallest solution:

$pt(p) = \{ \text{alloc-1}, y, z \}$

$pt(q) = \{ y \}$

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Steensgaard's analysis

- View assignments as being bidirectional
- Generate constraints:
 - $X = \text{alloc } P:$ $\llbracket X \rrbracket = \&\llbracket \text{alloc-}i \rrbracket$
 - $X = \&Y:$ $\llbracket X \rrbracket = \&\llbracket Y \rrbracket$
 - $X = Y:$ $\llbracket X \rrbracket = \llbracket Y \rrbracket$
 - $X = *Y:$ $\llbracket Y \rrbracket = \&\alpha \wedge \llbracket X \rrbracket = \alpha$ where α is fresh
 - $*X = Y:$ $\llbracket X \rrbracket = \&\alpha \wedge \llbracket Y \rrbracket = \alpha$ where α is fresh
- Terms:
 - term variables, e.g. $\llbracket X \rrbracket$, $\llbracket \text{alloc-}i \rrbracket$, α (each representing the possible values of a cell)
 - a single (unary) term constructor $\&t$ (representing the location of the cell that t represents)
 - $\llbracket X \rrbracket$ is now a term variable, not a constraint variable holding a set of locations
- Fits with our unification solver! (union-find...)
- The points-to map is defined as $\text{pt}(X) = \{ c \in \text{Cells} \mid \llbracket X \rrbracket = \&\llbracket c \rrbracket \}$
- Note that there is only one kind of term constructor, so unification never fails₁₆

Applying Steensgaard

- Generated constraints:

$\&alloc-1 \in \llbracket p \rrbracket$

$\llbracket y \rrbracket = \llbracket x \rrbracket$

$\llbracket z \rrbracket = \llbracket x \rrbracket$

$\&\alpha \in \llbracket p \rrbracket \Rightarrow \llbracket z \rrbracket = \llbracket \alpha \rrbracket$

$\llbracket q \rrbracket = \llbracket p \rrbracket$

$\&y \in \llbracket q \rrbracket$

$\&\alpha \in \llbracket p \rrbracket \Rightarrow \llbracket \alpha \rrbracket = \llbracket x \rrbracket$

$\&z \in \llbracket p \rrbracket$

+ the extra constraints

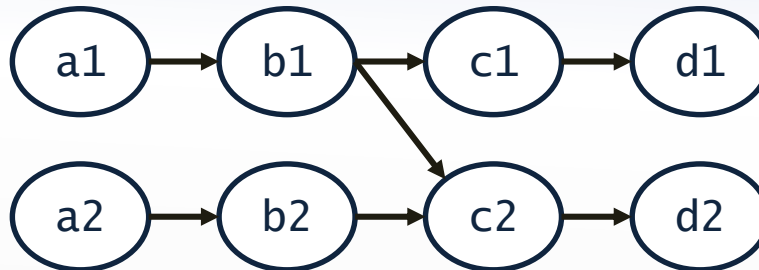
- Smallest solution:

$pt(p) = \{ \&alloc-1, y, z \}$

$pt(q) = \{ \&alloc-1, y, z \}$

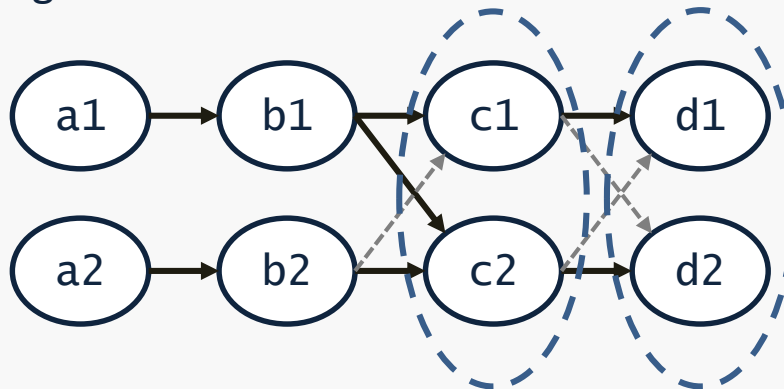
Another example

Andersen:



```
a1 = &b1;  
b1 = &c1;  
c1 = &d1;  
a2 = &b2;  
b2 = &c2;  
c2 = &d2;  
b1 = &c2;
```

Steensgaard:



Recall our type analysis...

- Focusing on pointers...

- Constraints:

- $X = \text{alloc } P:$ $\llbracket X \rrbracket = \&\llbracket P \rrbracket$
- $X = \&Y:$ $\llbracket X \rrbracket = \&\llbracket Y \rrbracket$
- $X = Y:$ $\llbracket X \rrbracket = \llbracket Y \rrbracket$
- $X = *Y:$ $\&\llbracket X \rrbracket = \llbracket Y \rrbracket$
- $*X = Y:$ $\llbracket X \rrbracket = \&\llbracket Y \rrbracket$

- Implicit extra constraint for term equality:

$$\&t_1 = \&t_2 \Rightarrow t_1 = t_2$$

- Assuming the program type checks, is the solution for pointers the same as for Steensgaard's analysis?

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Interprocedural points-to analysis

- If function pointers are distinct from heap pointers:
 - first run a CFA
 - then run Andersen or Steensgaard
- But in TIP both kinds may be mixed together:
 $(***x) (1, 2, 3)$
- In this case the CFA and the points-to analysis must happen *simultaneously!*

Function call normalization

- Assume that all function calls are of the form

$$x = y(a_1, \dots, a_n)$$

- y may be a variable whose value is a function pointer
- Assume that all return statements are of the form

`return z;`

- As usual, simply introduce lots of temporary variables...
- Include all function names in *Locs*

CFA with Andersen

- For the function call
 $x = y(a_1, \dots, a_n)$
and every occurrence of

$f(x_1, \dots, x_n) \{ \dots \text{return } z; \}$

add these constraints:

$$f \in \llbracket f \rrbracket$$

$$f \in \llbracket y \rrbracket \Rightarrow (\llbracket a_i \rrbracket \subseteq \llbracket x_i \rrbracket \text{ for } i=1, \dots, n \wedge \llbracket z \rrbracket \subseteq \llbracket x \rrbracket)$$

- (Similarly for simple function calls)
- Fits directly into the cubic framework!

*Andersen's analysis is
already closely connected
to control-flow analysis!*

CFA with Steensgaard

- For the function call

$$x = y(a_1, \dots, a_n)$$

and every occurrence of

$$f(x_1, \dots, x_n) \{ \dots \text{return } z; \}$$

add these constraints:

$$f \in \llbracket f \rrbracket$$

$$f \in \llbracket y \rrbracket \Rightarrow (\llbracket a_i \rrbracket = \llbracket x_i \rrbracket \text{ for } i=1, \dots, n \wedge \llbracket z \rrbracket = \llbracket x \rrbracket)$$

- (Similarly for simple function calls)
- Fits into the unification framework, but requires a generalization of the ordinary union-find solver

Context-sensitive pointer analysis

- Generalize the abstract domain $Cells \rightarrow 2^{Locs}$ to
 $Contexts \rightarrow Cells \rightarrow 2^{Locs}$
(or equivalently: $Cells \times Contexts \rightarrow 2^{Locs}$)
where $Contexts$ is a (finite) set of call contexts
- As usual, many possible choices of $Contexts$
 - recall the call string approach and the functional approach
- Also need to track the set of reachable contexts for each function (like the use of lifted lattices earlier)
- Does this still fit into the cubic solver?

Context-sensitive pointer analysis

```
foo(a) {  
    return *a;  
}  
  
bar() {  
    ...  
    x = alloc null; // alloc-1  
    y = alloc null; // alloc-2  
    *x = alloc null; // alloc-3  
    *y = alloc null; // alloc-4  
    ...  
    q = foo(x);  
    w = foo(y);  
    ...  
}
```

Are q and w aliases?

Context-sensitive pointer analysis

```
mk() {  
    return alloc null; // alloc-1  
}  
  
baz() {  
    var x,y;  
    x = mk();  
    y = mk();  
    ...  
}
```

Are x and y aliases?

Context-sensitive pointer analysis

- We can go one step further and introduce *context-sensitive heap* (a.k.a. *heap cloning*)
- Let each abstract cell be a pair of
 - $a\uparrow\uparrow\text{loc}-i$ (the $a\uparrow\uparrow\text{loc}$ with index i) or X (a program variable)
 - a heap context from a (finite) set *HeapContexts*
- This allows abstract cells to be named by the source code allocation site ***and (information from) the current context***
- One choice:
 - set *HeapContexts* = *Contexts*
 - at $a\uparrow\uparrow\text{loc}$, use the entire current call context as heap context

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Null pointer analysis

- Decide for every dereference $*p$, is p different from `null`?
- (Why not just treat null as a special location in an Andersen or Steensgaard-style analysis?)
- Use the monotone framework
 - assuming that a points-to map pt has been computed
- Let us consider an intraprocedural analysis (i.e. we ignore function calls)

A lattice for null analysis

- Define the simple lattice *Null*:



where NN represents “definitely **not null**”
and ? represents “maybe null”

- Use for every program point the map lattice:

$Cells \rightarrow Null$

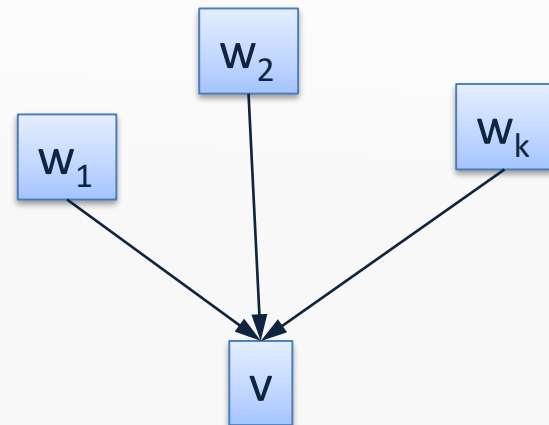
Setting up

- For every CFG node, v , we have a variable $\llbracket v \rrbracket$:
 - a map giving abstract values for all cells at the program point *after* v

- Auxiliary definition:

$$JOIN(v) = \sqcup_{w \in pred(v)} \llbracket w \rrbracket$$

(i.e. we make a *forward* analysis)



Null analysis constraints

- For operations involving pointers:
 - $X = \text{alloc } P:$ $\llbracket v \rrbracket = ???$
 - $X = \&Y:$ $\llbracket v \rrbracket = ???$
 - $X = Y:$ $\llbracket v \rrbracket = ???$
 - $X = *Y:$ $\llbracket v \rrbracket = ???$
 - $*X = Y:$ $\llbracket v \rrbracket = ???$
 - $X = \text{null}:$ $\llbracket v \rrbracket = ???$
- For all other CFG nodes:
 - $\llbracket v \rrbracket = \text{JOIN}(v)$

Null analysis constraints

- For a heap store operation $*X = Y$ we need to model the change of whatever X points to
- That may be *multiple* abstract cells (i.e. the cells $pt(X)$)
- With the present abstraction, each abstract heap cell $a11oc-i$ may describe *multiple* concrete cells
- So we settle for **weak** update:

$$*X = Y: \quad \llbracket v \rrbracket = store(JOIN(v), X, Y)$$

$$\text{where } store(\sigma, X, Y) = \sigma[\alpha \mapsto \frac{\sigma(\alpha) \sqcup \sigma(Y)}{\alpha \in pt(X)}]$$

Null analysis constraints

- For a heap load operation $X = *Y$ we need to model the change of the program variable X
- Our abstraction has a single abstract cell for X
- That abstract cell represents a single concrete cell
- So we can use strong update:

$$X = *Y: \quad \llbracket v \rrbracket = load(JOIN(v), X, Y)$$

$$\text{where } load(\sigma, X, Y) = \sigma[X \mapsto \bigsqcup_{\alpha \in pt(Y)} \sigma(\alpha)]$$

Strong and weak updates

```
mk() {  
    return alloc null; // alloc-1  
}  
  
...  
a = mk();  
b = mk();  
*a = alloc null; // alloc-2  
n = null;  
*b = n; // strong update here would be unsound!  
c = *a;
```

is c null here?



The abstract cell `alloc-1` corresponds to *multiple concrete cells*

Strong and weak updates

```
a = alloc null; // alloc-1
b = alloc null; // alloc-2
*a = alloc null; // alloc-3
*b = alloc null; // alloc-4
if (...) {
    x = a;
} else {
    x = b;
}
n = null;
*x = n; // strong update here would be unsound!
c = *x;
```

is C null here?



The points-to set for X contains *multiple abstract cells*

Null analysis constraints

- $X = \text{alloc } P$: $\llbracket v \rrbracket = \text{JOIN}(v)[X \mapsto \text{NN}, \text{alloc-i} \mapsto ?]$
 - $X = \&Y$: $\llbracket v \rrbracket = \text{JOIN}(v)[X \mapsto \text{NN}]$
 - $X = Y$: $\llbracket v \rrbracket = \text{JOIN}(v)[X \mapsto \text{JOIN}(v)(Y)]$
 - $X = \text{null}$: $\llbracket v \rrbracket = \text{JOIN}(v)[X \mapsto ?]$
-
- In each case, the assignment modifies a program variable
 - So we can use strong updates, as for heap load operations

Strong and weak updates, revisited

- Strong update: $\sigma[c \mapsto \textit{new-value}]$
 - possible if c is known to refer to a single concrete cell
 - works for assignments to local variables
(as long as TIP doesn't have e.g. nested functions)
- Weak update: $\sigma[c \mapsto \underline{\sigma(c)} \sqcup \textit{new-value}]$
 - necessary if c may refer to multiple concrete cells
 - bad for precision, we lose some of the power of flow-sensitivity
 - required for assignments to heap cells
(unless we extend the analysis abstraction!)

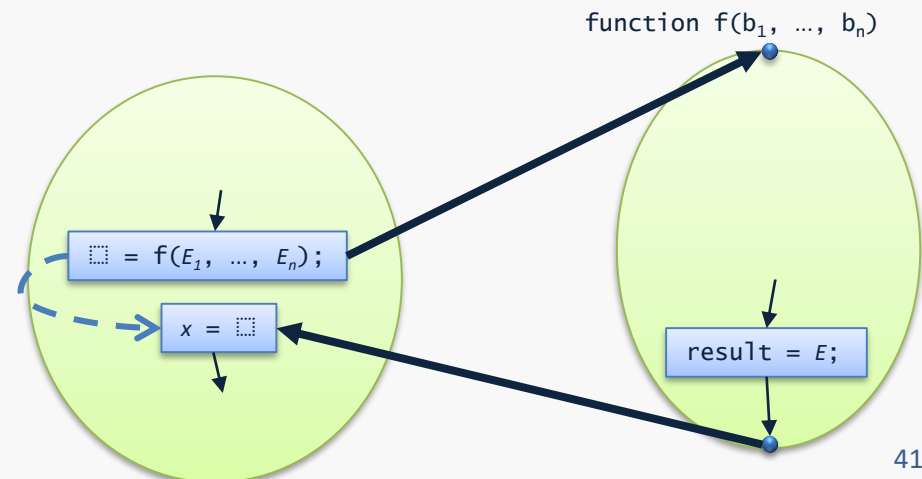
Interprocedural null analysis

- Context insensitive or context sensitive, as usual...
 - at the after-call node, use the heap from the callee

- But be careful!

Pointers to local variables may escape to the callee

- the abstract state at the after-call node cannot simply copy the abstract values for local variables from the abstract state at the call node



Using the null analysis

- The pointer dereference $*p$ is “safe” at entry of v if $JOIN(v)(p) = NN$
- The quality of the null analysis depends on the quality of the underlying points-to analysis

Example program

```
p = alloc null;  
q = &p;  
n = null;  
*q = n;  
*p = n;
```

Andersen generates:

$$pt(p) = \{alloc-1\}$$
$$pt(q) = \{p\}$$
$$pt(n) = \emptyset$$

Generated constraints

$$\llbracket p = \text{alloc } \text{null} \rrbracket = \perp [p \mapsto \text{NN}, \text{alloc-1} \mapsto ?]$$
$$\llbracket q = \&p \rrbracket = \llbracket p = \text{alloc } \text{null} \rrbracket [q \mapsto \text{NN}]$$
$$\llbracket n = \text{null} \rrbracket = \llbracket q = \&p \rrbracket [n \mapsto ?]$$
$$\llbracket *q = n \rrbracket = \llbracket n = \text{null} \rrbracket [p \mapsto \llbracket n = \text{null} \rrbracket(p) \sqcup \llbracket n = \text{null} \rrbracket(n)]$$
$$\llbracket *p = n \rrbracket = \llbracket *q = n \rrbracket [\text{alloc-1} \mapsto \llbracket *q = n \rrbracket(\text{alloc-1}) \sqcup \llbracket *q = n \rrbracket(n)]$$

Solution

$\llbracket p = \text{alloc } \text{null} \rrbracket = [p \mapsto \text{NN}, q \mapsto \text{NN}, n \mapsto \text{NN}, \text{alloc-1} \mapsto ?]$

$\llbracket q = \&p \rrbracket = [p \mapsto \text{NN}, q \mapsto \text{NN}, n \mapsto \text{NN}, \text{alloc-1} \mapsto ?]$

$\llbracket n = \text{null} \rrbracket = [p \mapsto \text{NN}, q \mapsto \text{NN}, n \mapsto ?, \text{alloc-1} \mapsto ?]$

$\llbracket *q = n \rrbracket = [p \mapsto ?, q \mapsto \text{NN}, n \mapsto ?, \text{alloc-1} \mapsto ?]$

$\llbracket *p = n \rrbracket = [p \mapsto ?, q \mapsto \text{NN}, n \mapsto ?, \text{alloc-1} \mapsto ?]$

- At the program point before the statement $*q = n$ the analysis now knows that q is definitely non-null
- ... and before $*p = n$, the pointer p is maybe null
- Due to the weak updates for all heap store operations, precision is bad for $\text{alloc-}i$ locations

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Points-to graphs

- Graphs that describe possible heaps:
 - nodes are abstract cells
 - edges are possible pointers between the cells
- The lattice of points-to graphs is $2^{Cells \times Cells}$ ordered under subset inclusion (or alternatively, $Cells \rightarrow 2^{Cells}$)
- For every CFG node, v , we introduce a constraint variable $\llbracket v \rrbracket$ describing the state *after* v
- Intraprocedural analysis (i.e. ignore function calls)

Constraints

- For pointer operations:
 - $X = \text{alloc } P$: $\llbracket v \rrbracket = \text{JOIN}(v) \downarrow X \cup \{ (X, \text{alloc-}i) \}$
 - $X = \&Y$: $\llbracket v \rrbracket = \text{JOIN}(v) \downarrow X \cup \{ (X, Y) \}$
 - $X = Y$: $\llbracket v \rrbracket = \text{assign}(\text{JOIN}(v), X, Y)$
 - $X = *Y$: $\llbracket v \rrbracket = \text{load}(\text{JOIN}(v), X, Y)$
 - $*X = Y$: $\llbracket v \rrbracket = \text{store}(\text{JOIN}(v), X, Y)$
 - $X = \text{null}$: $\llbracket v \rrbracket = \text{JOIN}(v) \downarrow X$
- For all other CFG nodes:
 - $\llbracket v \rrbracket = \text{JOIN}(v)$

Auxiliary functions

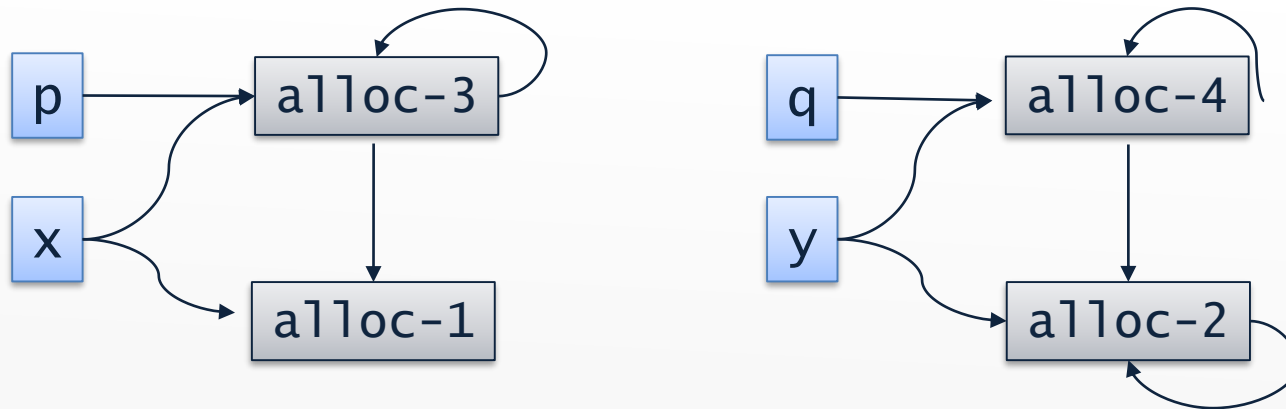
- $JOIN(v) = \bigcup_{w \in pred(v)} \llbracket w \rrbracket$
- $\sigma \downarrow X = \{ (s, t) \in \sigma \mid s \neq X \}$
- $assign(\sigma, X, Y) = \sigma \downarrow X \cup \{ (X, t) \mid (Y, t) \in \sigma \}$
- $load(\sigma, X, Y) = \sigma \downarrow X \cup \{ (X, t) \mid (Y, s) \in \sigma, (s, t) \in \sigma \}$
- $store(\sigma, X, Y) = \sigma \cup \{ (s, t) \mid (X, s) \in \sigma, (Y, t) \in \sigma \}$
 - note: weak update!

Example program

```
var x,y,n,p,q;  
x = alloc null; y = alloc null;  
*x = null; *y = y;  
n = input;  
while (n>0) {  
    p = alloc null; q = alloc null;  
    *p = x; *q = y;  
    x = p; y = q;  
    n = n-1;  
}
```


Result of analysis

- After the loop we have this points-to graph:



- We conclude that x and y will always be disjoint

Points-to maps from points-to graphs

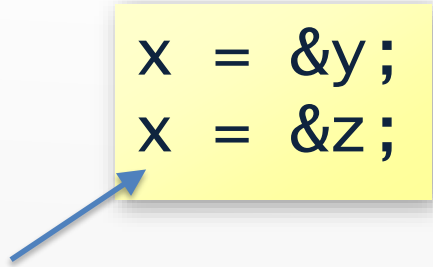
- A points-to map for each program point v :

$$pt(X) = \{ t \mid (X, t) \in \llbracket v \rrbracket \}$$

- More expensive, but more precise:

– Andersen: $pt(x) = \{ y, z \}$

– flow-sensitive: $pt(x) = \{ z \}$



```
x = &y;  
x = &z;
```

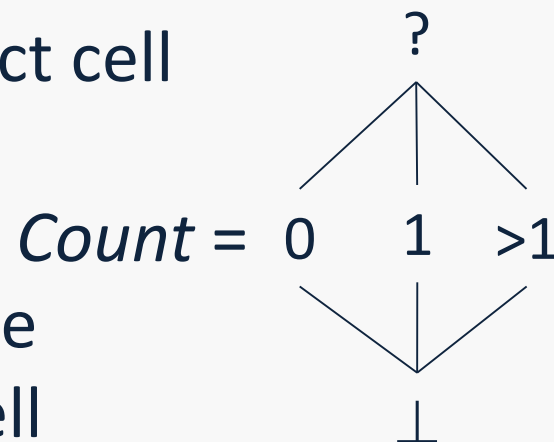
Improving precision with abstract counting

- The points-to graph is missing information:
 - a1loc-2 nodes always form a self-loop in the example
- We need a more detailed lattice:

$$2^{Cell \times Cell} \times (Cell \rightarrow Count)$$

where we for each cell keep track of how many concrete cells that abstract cell describes

- This permits **strong updates** on those that describe precisely 1 concrete cell

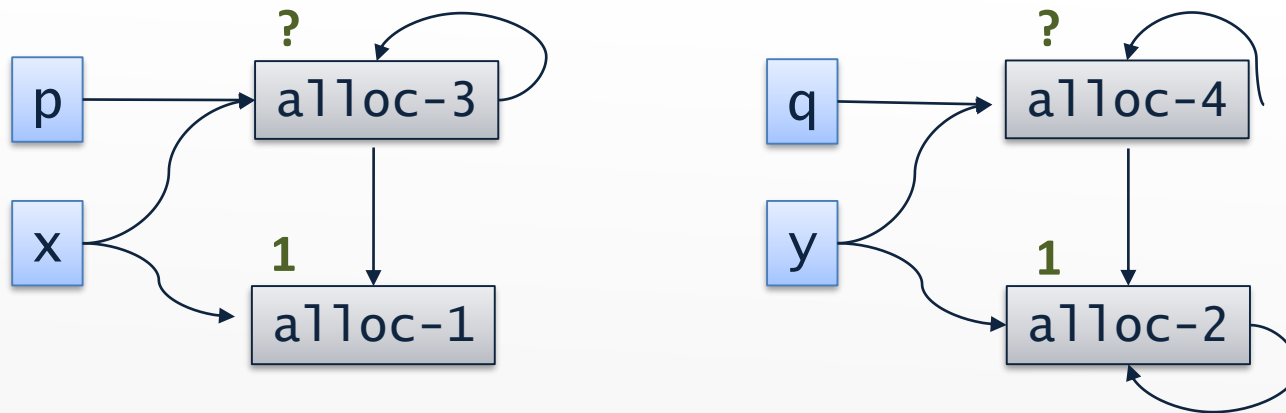


Constraints

- $X = \text{alloc } P:$...
- $*X = Y:$...
- ...

Better results

- After the loop we have this extended points-to graph:



- Thus, alloc-2 nodes form a self-loop

Interprocedural shape analysis

New issues to consider:

- parameter passing etc.
- weak updates to stack cells
- escaping of stack cells

Escape analysis

- Perform a points-to analysis
- Look at return expression
- Check reachability in the points-to graph to arguments or variables defined in the function itself

- None of those



no escaping stack cells

```
baz() {  
    var x;  
    return &x;  
}  
  
main() {  
    var p;  
    p=baz();  
    *p=1;  
    return *p;  
}
```