



LUND
UNIVERSITY

EDAP15: Program Analysis

POINTER ANALYSIS 1
HEAP MODELS

Christoph Reichenbach



Dataflow Analysis

Analyse properties of variables or basic blocks

Examples in practice:

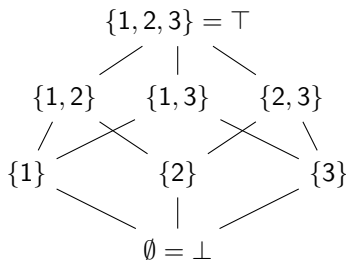
- ▶ *Live Variables*

Is this variable ever read?

- ▶ *Reaching Values*

What are the possible values for this variable?

Analyses on Powerset Lattices (1/2)



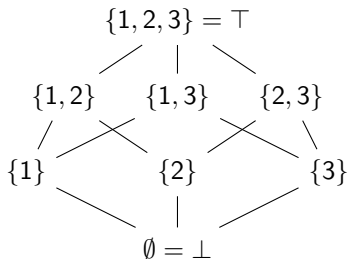
$$\text{join}_b = \sqcup = \cup$$

$$S = \{1, 2, 3\}$$

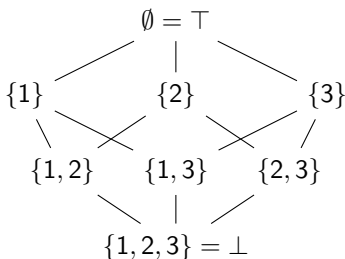
► Examples:

- $S \subseteq \mathbb{Z}$ (*Reaching Definitions*)
 - $S = \text{Numeric Constants in code} \cup \{0, 1\}$
- $S = \text{Variables}$ (*Live Variables*)
- $S = \text{Program Locations}$ (*alt. Reaching Definitions*)
- $S = \text{Types}$
- Abstract Domain: Powerset $\mathcal{P}(S)$
 - Finite iff S is finite

Analyses on Powerset Lattices (2/2)



$$\text{join}_b = \sqcup = \cup$$



$$\text{join}_b = \sqcup = \cap$$

- ▶ join_b can be \cup or \cap
- ▶ \cup :
 - ▶ Property that is true on *some* path
 - ▶ **May**-analysis
- ▶ \cap :
 - ▶ Property that is true over *all* paths
 - ▶ **Must**-analysis

Available Expressions

“Which expressions do we currently have evaluated and stored?”

Teal

```
var y := 2 + z;  
var x := 3 * z;  
if z > 0 {  
    x := 4;  
}  
f(2 + z); // Can re-use y here!  
f(3 * z); // Can NOT re-use x here!
```

- ▶ Forward analysis
- ▶ $join_b = \sqcup = \cap$

Very Busy Expressions

“Which expression do we definitely need to evaluate at least once?”

Teal

```
// (x / 42) is very busy: (A), (B).  
// Can eval early!  
if z > 0 {  
    x := 4 + x / 42; // (A)  
    y := 1;  
} else {  
    x := x / 42; // (B)  
}  
g(x);
```

- Backwards analysis
- $join_b = \sqcup = \cap$

Summary

- ▶ Data Flow Analysis in Monotone Frameworks:

- ▶ **Forward** or **Backward**?
- ▶ **May** or **Must**?
- ▶ Which Lattice, \sqcup , \top , \perp ?
- ▶ Which transfer functions?

	May	Must
Forward	Reaching Definitions	Available Expressions
Backward	Live Variables	Very Busy Expressions

Our Memory Modelling Until Now

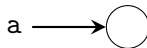
- ▶ Our analyses so far have considered:
 - ▶ Static Variables
 - ▶ Local (stack-dynamic) Variables
 - ▶ (Stack-dynamic) parameters

Missing: heap variables!

Example Program

Example

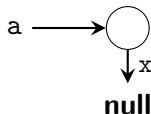
```
a := new();    // ⇐  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

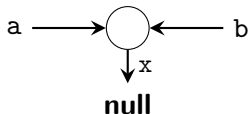
```
a := new();  
a.x := null;  // ⇐  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

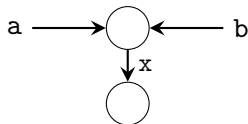
```
a := new();  
a.x := null;  
b := a;      // ⇐  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

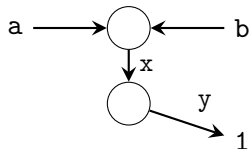
```
a := new();  
a.x := null;  
b := a;  
b.x := new(); // ⇐  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

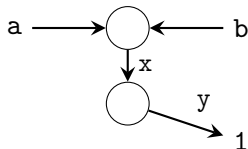
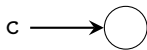
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;    // ←  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

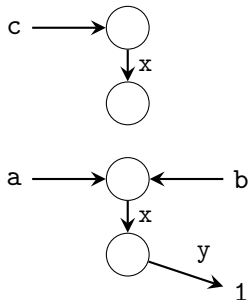
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();    // ⇐  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

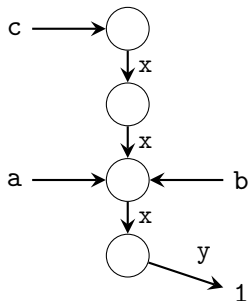
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new(); // ⇐  
c.x.x := a;  
c := a.x;  
// A
```



Example Program

Example

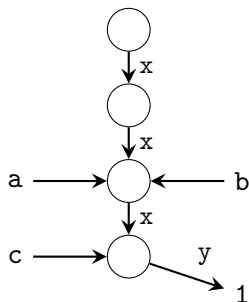
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;    // ⇐  
c := a.x;  
// A
```



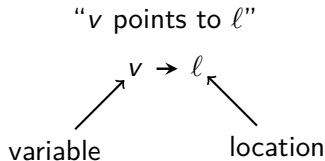
Example Program

Example

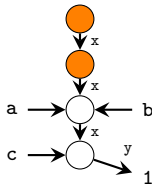
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;      // ⇐  
// A
```



Concrete Heap Graph



- ▶ Heap graph connects memory locations
- ▶ Represents all heap-allocated objects and their points-to relationships
- ▶ Edges labelled with field names
- ▶ **Some objects** not reachable from variables



Aliasing

Example

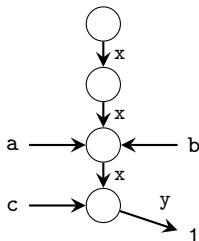
```
a := new();  
a.x := null;  
b := a;  
b.x := new();  
a.x.y := 1;  
c := new();  
c.x := new();  
c.x.x := a;  
c := a.x;  
// A
```

Aliases at *// A*:

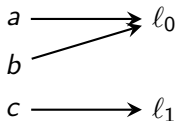
- ▶ a and b represent the same object
- ⇒ a and b are *aliased*

$$a \stackrel{\text{alias}}{=} b$$

- ⇒ a.x and b.x are *aliased*
- ▶ c and a.x and b.x are *aliased*



Pointer Analysis



- *Points-To Analysis:*

- Analyse *heap usage*
- Which *variables* may/must point to which *heap locations*?

$$a \rightarrow \ell_0$$

- *Alias Analysis:*

- Analyse *address sharing*
- Which *pair/set of variables* may/must point to the same address?

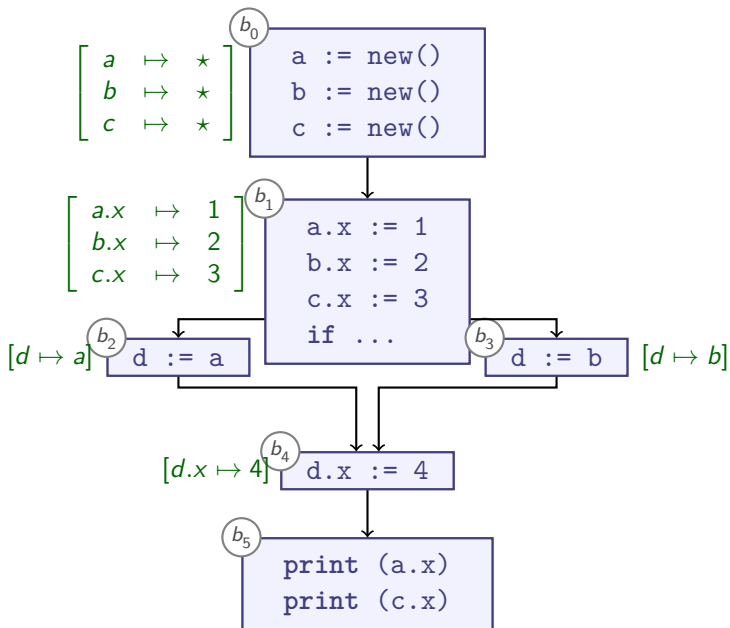
$$a \stackrel{\text{alias}}{=} b$$

Summary: Pointer Analysis

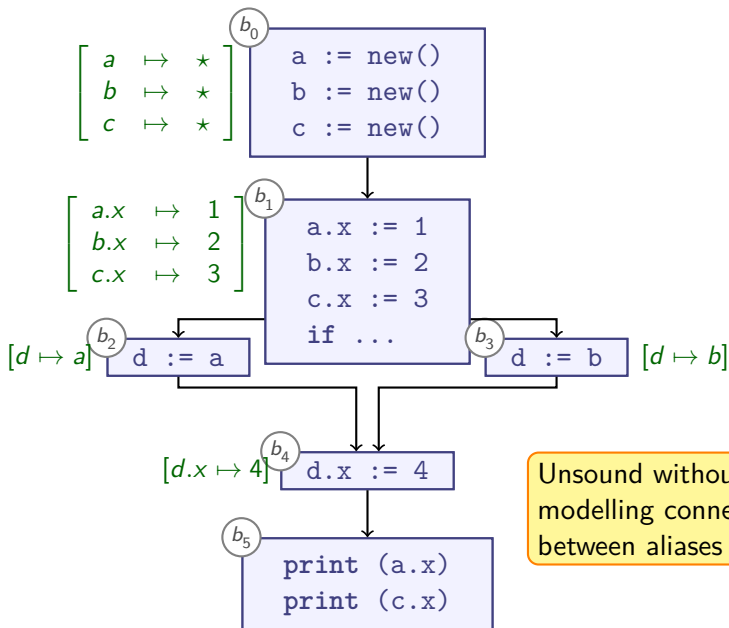
- ▶ Class of analyses to model dynamic heap allocation
- ▶ **Points-To Analysis:** computes mapping
 - ▶ From *variables*
 - ▶ To *pointees* (other variables)
 - ▶ More general than Alias Analysis
- ▶ **Alias Analysis:** computes
 - ▶ *Sharing information* between variables
 - ▶ Implicitly produced by points-to analysis

$$a \stackrel{\text{alias}}{=} b \iff a \rightarrow \ell \leftarrow b$$

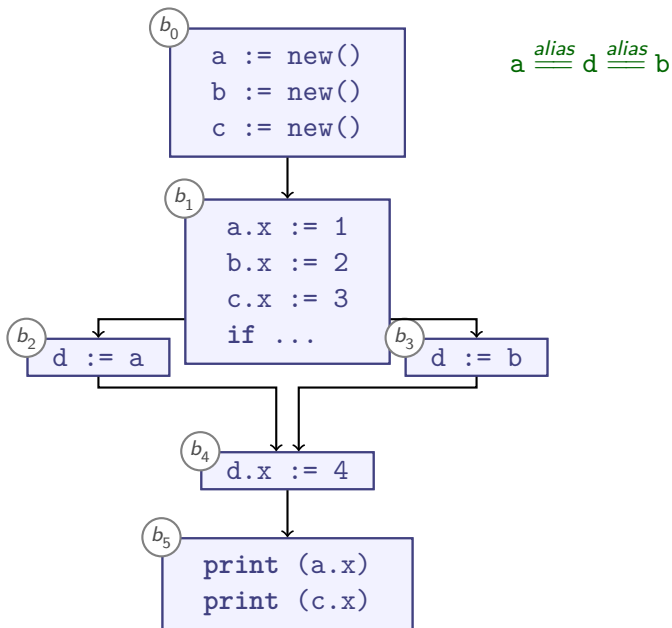
Dataflow with Alias Information



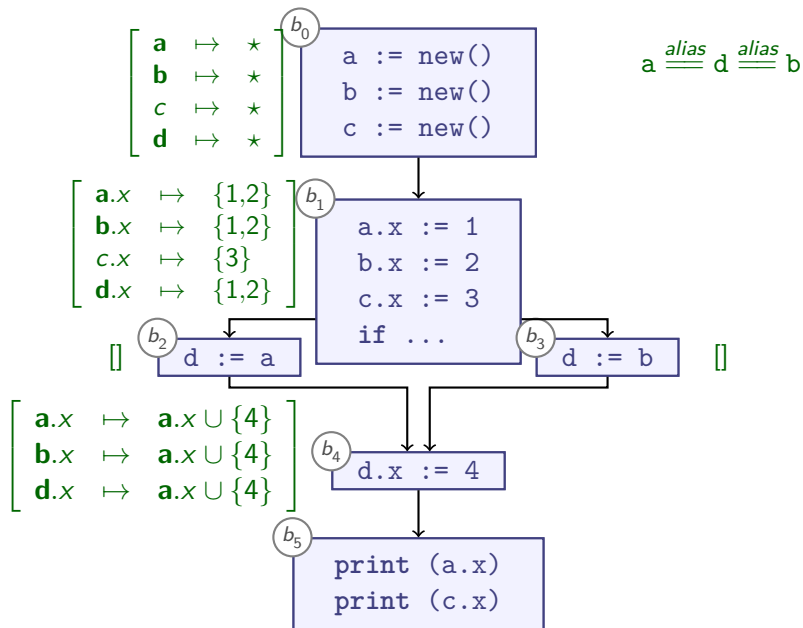
Dataflow with Alias Information



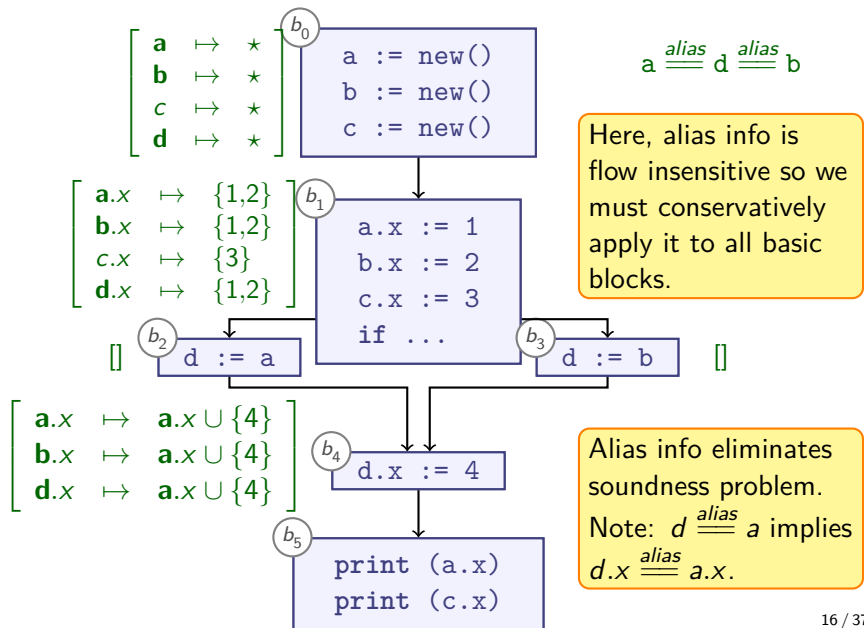
Dataflow with Alias Information



Dataflow with Alias Information



Dataflow with Alias Information



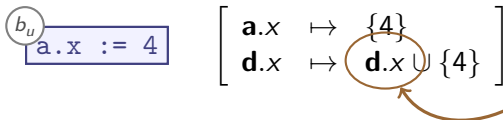
Dataflow + Aliases

- ▶ Aliasing affects shared fields:

$$a \stackrel{\text{alias}}{=} d \implies a.x \stackrel{\text{alias}}{=} d.x \text{ for all } x$$

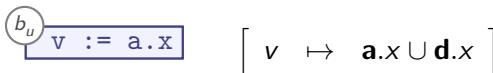
- ▶ Use aliasing knowledge in one of these ways:

- 1 Multiply *updates* for each alias:

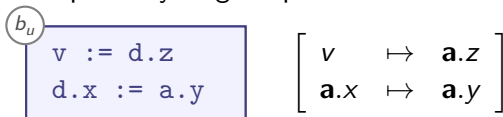


Using MAY alias info means that we might or might not update the aliased object.

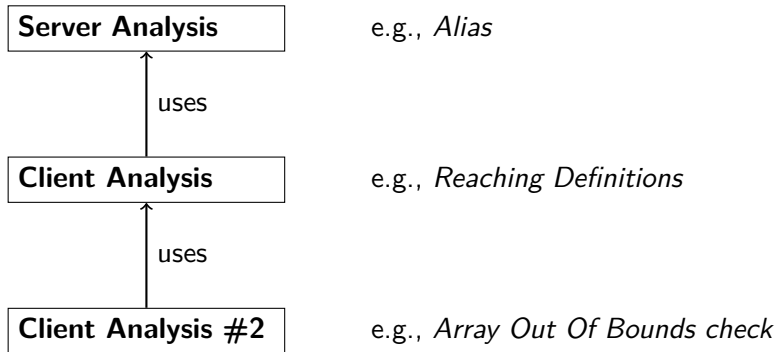
- 2 Multiply *reads* for each alias:



- 3 Replace aliased paths by single representative:



Collaboration in Program Analysis



Analyses often form pipeline structures

Compute Aliases during Dataflow?

- ▶ Previously: Dataflow analysis as *analysis client* of Alias analysis:
- ▶ Can use Dataflow Analysis to compute pointer analyses
- ▶ Caveat:
 `y.field := z`
 - ▶ Transfer function updates `y.field` by `z`
 - ▶ Must extract both `y`, `z` from \mathbf{in}_b to compute update
 - ▶ *Non-distributive in practice*

Summary

- ▶ **Analysis client:** user of analysis, often another analysis
 - ▶ E.g., *Type analysis* is client of *name analysis*
- ▶ **Alias analysis** helps make dataflow analysis more precise
 - ▶ Fields inherit aliasing:

$$a \stackrel{\text{alias}}{=} b \quad \implies \quad a.x \stackrel{\text{alias}}{=} b.x \text{ for all } x$$

- ▶ So if $a.x \stackrel{\text{alias}}{=} b.y$, then:
 - ▶ $a.x.z \stackrel{\text{alias}}{=} b.y.z$
 - ▶ $a.x.z.z \stackrel{\text{alias}}{=} b.y.z.z$
 - ▶ $a.x.z.z.z \stackrel{\text{alias}}{=} b.y.z.z.z$ etc.
- ▶ Dataflow analysis can compute pointer analyses
 - ▶ Requires non-distributive framework for realistic languages

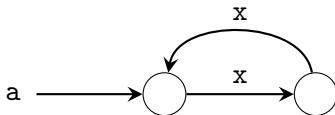
Concrete Heap Graphs (1/2)

Describe heap as a graph:

$$G_{\text{CHG}} = \langle \text{MemLoc}, \rightarrow, \bar{\rightarrow} \rangle$$

- ▶ G_{CHG} describes *actual* heap contents
- ▶ MemLoc are addressable memory locations
 - ▶ *Named* variables (a)
 - ▶ *Unnamed* variables (\bigcirc)
- ▶ Heap size typically 'unbounded for all practical purposes'

```
a := new Obj();  
a.x := new Obj();  
a.x.x := a;
```



Concrete Heap Graphs (2/2)

- ▶ Direct points-to references:

$$(\rightarrow) : Var \rightarrow MemLoc$$

- ▶ Language difference:
 - ▶ **Java/Teal**: Var is set of global / local variables and parameters
 - ▶ Disjoint from $MemLoc$
 - ▶ **C/C++**: $Var = MemLoc$
 - ▶ Address-of operator ($\&$) allows translating variable into $MemLoc$
- ▶ Points-to references via fields:

$$(\bar{\rightarrow}) : MemLoc \times Field \rightarrow MemLoc$$

- ▶ Field labels $Field$:
 - ▶ E.g., x in $'a.x'$ (Java) / $'a \rightarrow x'$ (C/C++)
 - ▶ Array indices for $'a[10]'$ (i.e., $\mathbb{N} \subseteq Field$)

Example

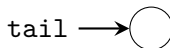
Teal-2

```
fun makeList(len) {  
    tail := new N();  
    tail.next := null;  
    body := tail;  
    while len > 0 {  
        t := body;  
        body := new N();  
        body.next := t;  
        len := len - 1;  
    }  
    list := new N();  
    list.head := body;  
    list.tail := tail;  
    return list;  
}
```

Example

Teal-2

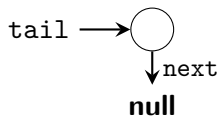
```
fun makeList(len) {  
  tail := new N(); //⇐  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

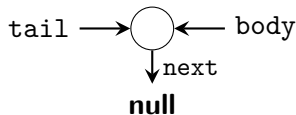
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null; //⇐  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

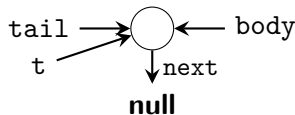
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;           //⇐  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

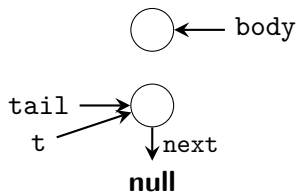
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;           // ←  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

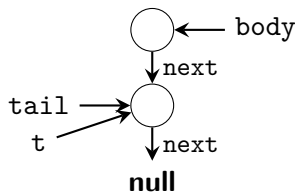
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N(); // ←  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

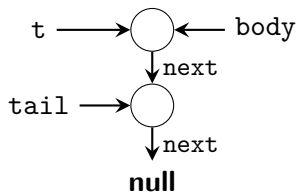
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t; // ←  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

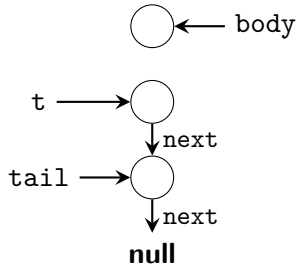
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;           // ←  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

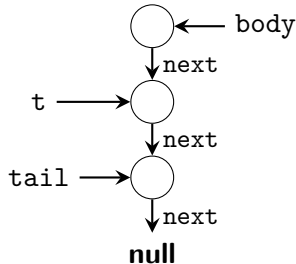
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N(); // ←  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

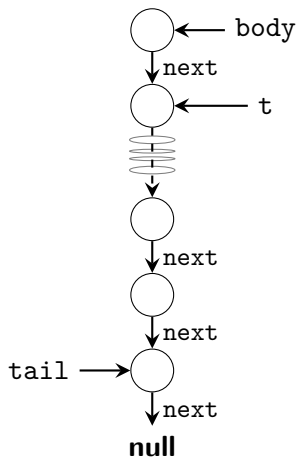
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t; // ←  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

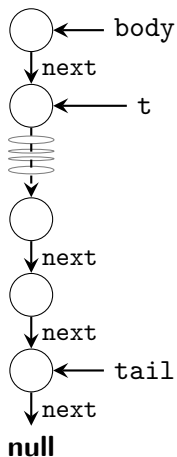
```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;           //⇐  
    body := new N();     //⇐  
    body.next := t;       //⇐  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```



Example

Teal-2

```
fun makeList(len) {  
  tail := new N();  
  tail.next := null;  
  body := tail;  
  while len > 0 {  
    t := body;  
    body := new N();  
    body.next := t;  
    len := len - 1;  
  }  
  list := new N();  
  list.head := body;  
  list.tail := tail;  
  return list;  
}
```

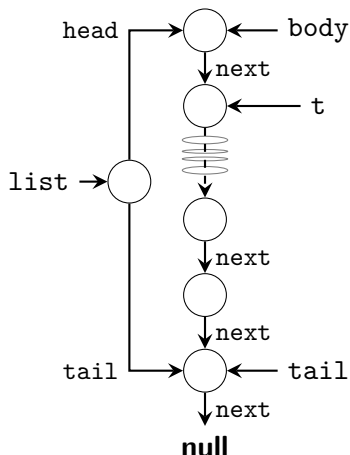


Managing Heap Graphs

- ▶ Size of Concrete Heap Graphs is unbounded
- ▶ **Store-less heap models:**
 - ▶ Hide heap locations
 - ▶ Model heap via *access paths*

```
list.head.next.next
```

Store-less Model



► Access path-based equivalences:

- **Must:** $\text{list.tail} \stackrel{\text{alias}}{=} \text{tail}$
- **Must:** $\text{list.head} \stackrel{\text{alias}}{=} \text{body}$
- **Must:** $\text{body.next} \stackrel{\text{alias}}{=} t$
- **May:** $\text{body.next}^* \stackrel{\text{alias}}{=} \text{tail}$
- Use *regular expressions* to denote repetition
- $\text{body.next}^* \stackrel{\text{alias}}{=} \text{tail}$ means:

body	$\stackrel{\text{alias}}{=}$	tail
body.next	$\stackrel{\text{alias}}{=}$	tail
body.next.next	$\stackrel{\text{alias}}{=}$	tail
...		

► For **May** or **Must** information

Summary

- ▶ **Concrete Heap Graph** (CHG) describes actual heap layout during execution
- ▶ CHG is unbounded, must summarise to analyse
- ▶ **Store-less Models:**
 - ▶ Use **access paths** to describe memory locations
 - ▶ Common in alias analysis

Managing Heap Graphs

- ▶ Size of Concrete Heap Graphs is unbounded

- ▶ **Store-less heap models:**

- ▶ Hide heap locations
 - ▶ Model heap via *access paths*

`list.head.next.next`

- ▶ **Store-based heap models:**

- ▶ Keep heap locations explicit
 - ▶ Introduce *Summary nodes* that can describe multiple CHG nodes

Store-based Model

- ▶ Concrete Heap Graph (CHG): graph of the program's reality

$$G_{\text{CHG}} = \langle \text{MemLoc}, \rightarrow, \bar{\rightarrow} \rangle$$

- ▶ Abstract Heap Graph (AHG): approximation of the program's reality

$$G_{\text{AHG}} = \langle \mathcal{P}(\text{MemLoc}), \rightarrow, \bar{\rightarrow} \rangle$$

$$(\rightarrow) : \mathcal{P}(\text{Var}) \rightarrow \mathcal{P}(\text{MemLoc})$$

$$(\bar{\rightarrow}) : \mathcal{P}(\text{MemLoc}) \times \mathcal{P}(\text{Field}) \rightarrow \mathcal{P}(\text{MemLoc})$$



- ▶ Key idea: AHG is *finite* graph that summarises CHG
- ▶ Soundness via:

$$\begin{array}{llll} v & \rightarrow & \ell & \text{implies} \quad \{v\} \cup V' \quad \rightarrow \quad \{\ell\} \cup L' \\ \ell_0 & \xrightarrow{f} & \ell_1 & \text{implies} \quad \{\ell_0\} \cup L'_0 \quad \xrightarrow{\{f\} \cup F'} \quad \{\ell_1\} \cup L'_1 \end{array}$$

- ▶ 'Any CHG edge is represented by (at least) one AHG edge'

Summary Nodes and Edges

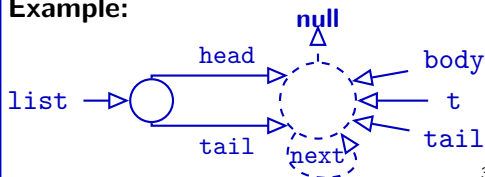
Notation:

- ▶ Abstract node $N \subseteq \text{MemLoc}$:
 - ▶ $|N| = 1$: *precise*: 
 - ▶ $|N| > 1$: *summary*: 
- ▶ Consider edge $V \rightarrow L$:
 - ▶ $|V| = 1$: *precise*:

$$V \longrightarrow L$$
 - ▶ $|V| > 1$: *summary*:

$$V \dashrightarrow L$$
- ▶ Analogous for $(\overset{f}{\rightarrow})$

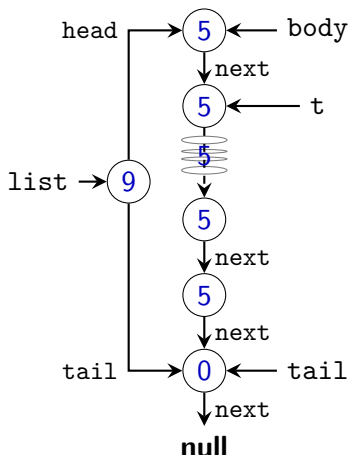
Example:



Summaries from Allocation Sites

Teal-2

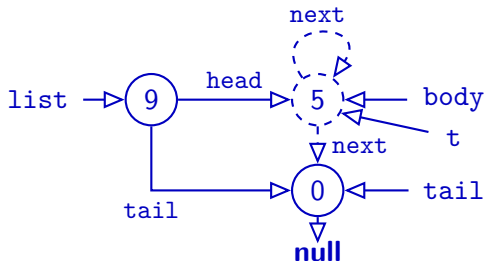
```
fun makeList(len) {  
  [0]  tail := new N();  
  [1]  tail.next := null;  
  [2]  body := tail;  
  [3]  while len > 0 {  
  [4]    t := body;  
  [5]    body := new N();  
  [6]    body.next := t;  
  [7]    len := len - 1;  
  [8]  }  
  [9]  list := new N();  
  [10] list.head := body;  
  [11] list.tail := tail;  
  [12] return list;  
}
```



Summaries from Allocation Sites

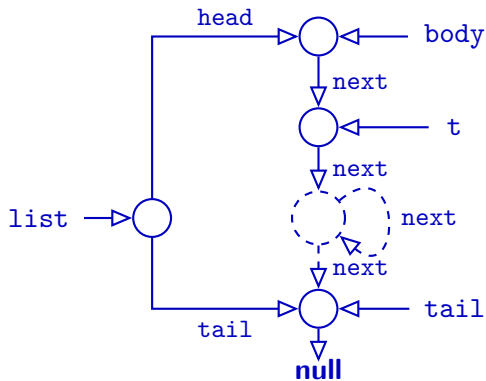
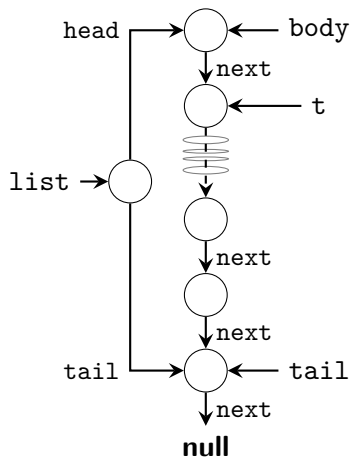
Teal-2

```
fun makeList(len) {  
  [0]  tail := new N();  
  [1]  tail.next := null;  
  [2]  body := tail;  
  [3]  while len > 0 {  
  [4]    t := body;  
  [5]    body := new N();  
  [6]    body.next := t;  
  [7]    len := len - 1;  
  [8]  }  
  [9]  list := new N();  
  [10] list.head := body;  
  [11] list.tail := tail;  
  [12] return list;  
}
```



- Summarise *MemLoc* allocated at same program location

Variable-Based Summaries



- Summarise *MemLoc* when not referenced by variables
- For **May** analyses: summarise nodes potentially pointed to by same set of variables

Summaries via k -Limiting

- ▶ k -Limiting: bound size
- ▶ Examples: Limiting...
- ▶ Access path length

Example ($k=3$):

<code>list.head.next</code>	\Rightarrow	<code>list.head.next</code>
<code>list.head.next.next</code>	\Rightarrow	<code>list.head.next*</code>
<code>list.head.next.next.next</code>	\Rightarrow	<code>list.head.next*</code>
<code>list.head.next.next.val</code>	\Rightarrow	<code>list.head.(val next)*</code>

- ▶ # of (\rightarrow) hops after named variable
- ▶ # of nodes transitively reachable via (\rightarrow) after named variable
- ▶ # of nodes in a loop / function body
- ...

Other Summary Techniques

- ▶ General idea: Map $\mathcal{P}(MemLoc)$ to finite (manageable!) set
- ▶ Can combine different techniques for increased precision
- ▶ Other techniques: distinguish heap nodes by:
 - ▶ How many edges point to the node?
 - ▶ Is the node in a cycle?
 - ▶ What is the type of the node? (`ArrayList`, `StringTokenizer`, `File`, ...)
 - ...

Design Considerations

- ▶ First goal remains: make output finite
- ▶ Useful for analysis clients
- ▶ Efficient to compute / represent
- ▶ When considering flow-sensitive models:
 - ▶ Different program locations will have different AHGs
 - ▶ Exploit sharing across program locations

Summary of Heap Summaries

- ▶ *Store-less Models:*
 - ▶ Common in alias analysis
- ▶ **Store-based Models:**
 - ▶ Use **Abstract Heap Graph** to summarise *Concrete Heap Graph*
 - ▶ Common for finding memory bugs
- ▶ Summarisation techniques:
 - ▶ **Allocation-Site Based:** summarise nodes allocated at same point in program
 - ▶ **k-Limiting:** Set bound on some property P : no more than k P s allowed
 - ▶ **Variable-Based:** summarise data not pointed to by variables or pointed to by the same variables (**May** analysis)
 - ▶ Many combinations / extensions conceivable