Static Analysis of Accessed Regions in Recursive Data Structures

> Stephen Chong Radu Rugina

Cornell University

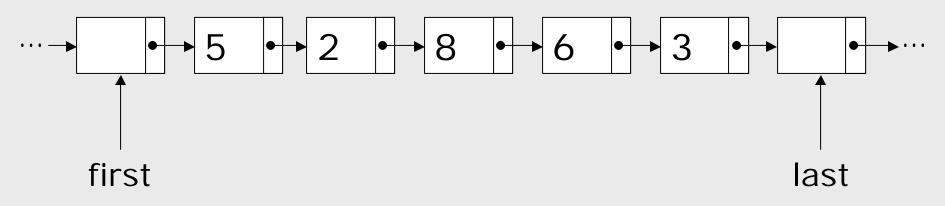
What This Talk is About

- Problem: Precise characterization of regions accessed by statements and procedures
 - For recursive programs with destructive updates
 - Fine-grained notion of regions: substructures within recursive data structures.
 - E.g. sublists within lists, sub trees within trees

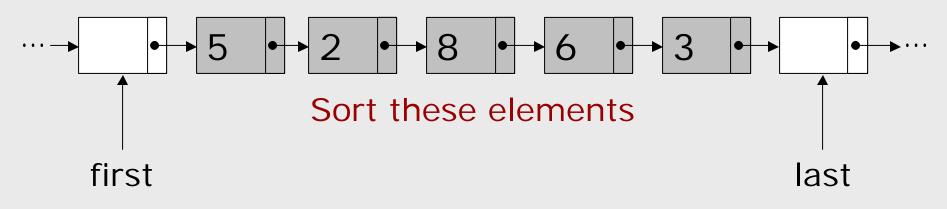
How we do it:

- Context sensitive interprocedural analysis algorithm
- Precise shape information
- Region access information
- Uses:
 - Parallelization, Program Understanding, Correctness

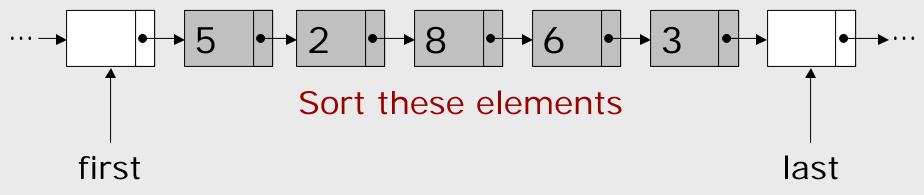
Sorts a sublist in place (i.e. with destructive updates)

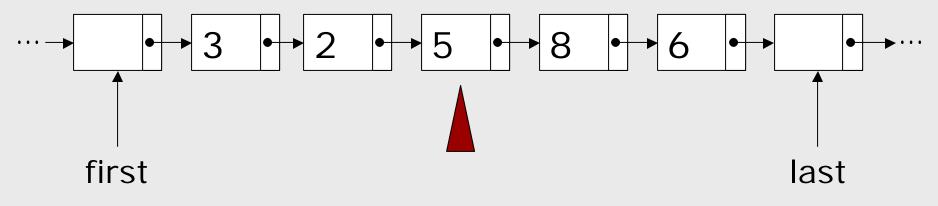


Sorts a sublist in place (i.e. with destructive updates)

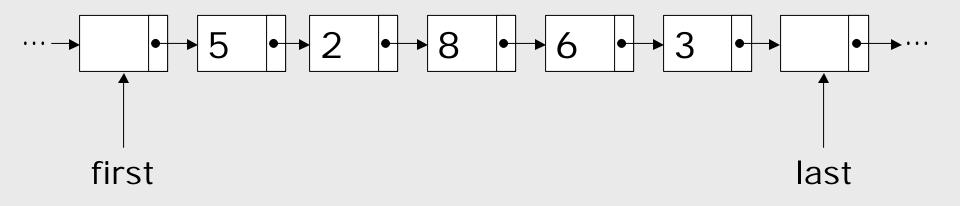


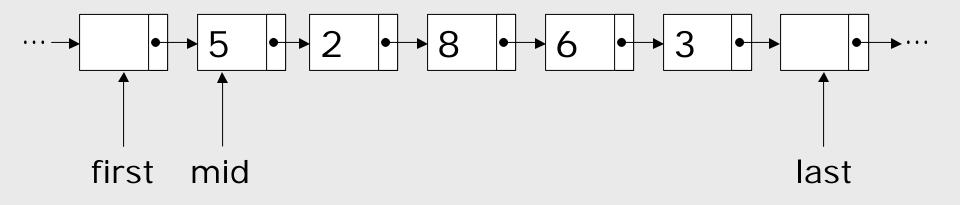
- Chooses a pivot value
- Partitions list into sublists destructively

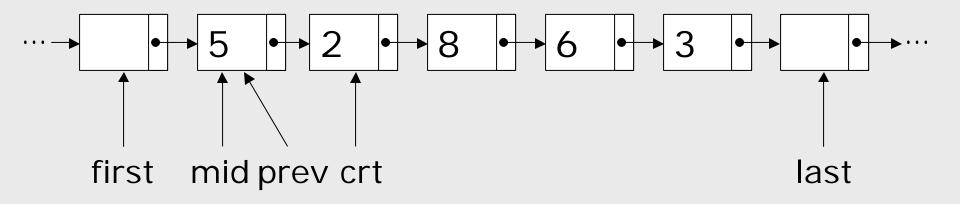


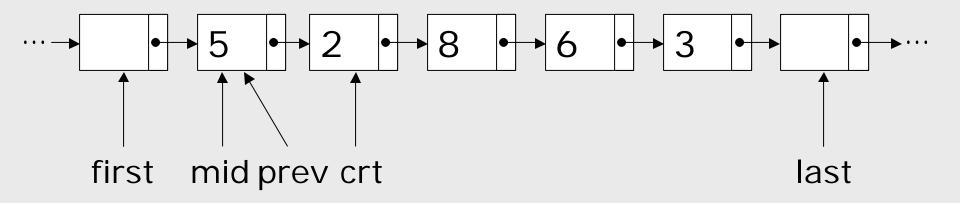


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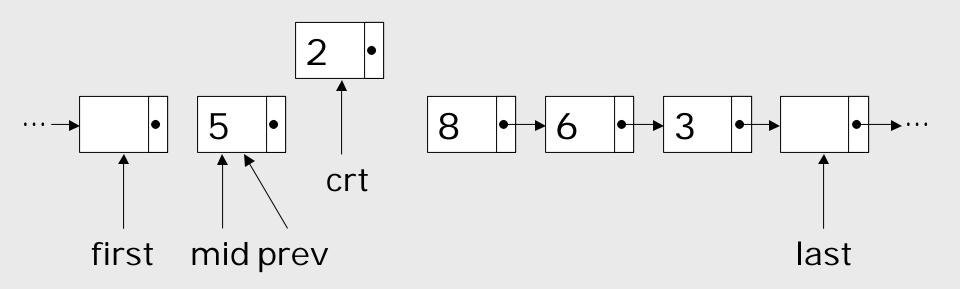






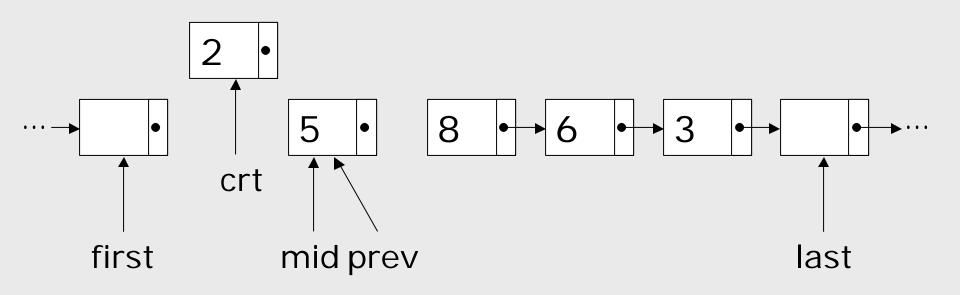
mid.val > crt.val ? Yes!

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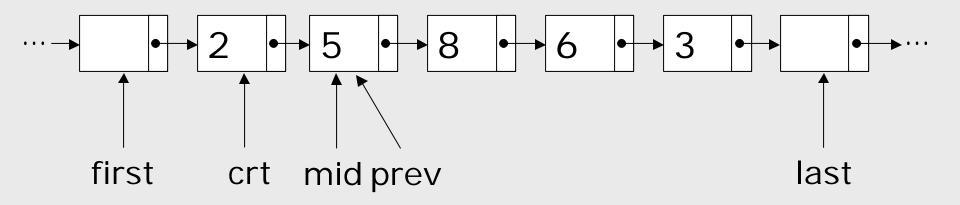
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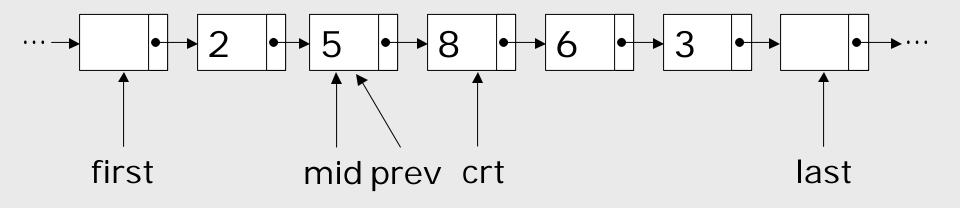
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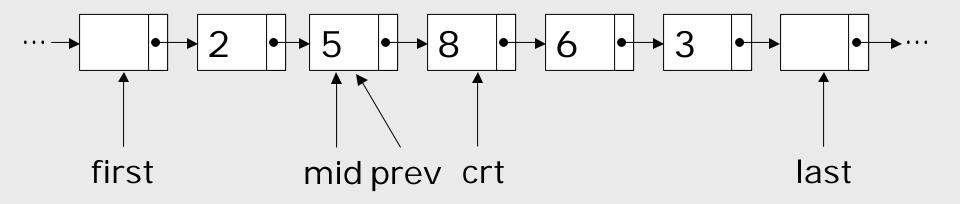
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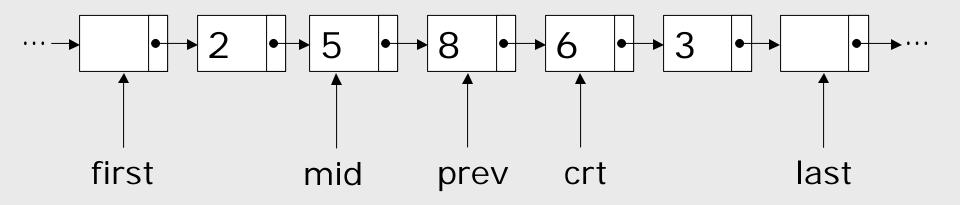
crt = prev->next

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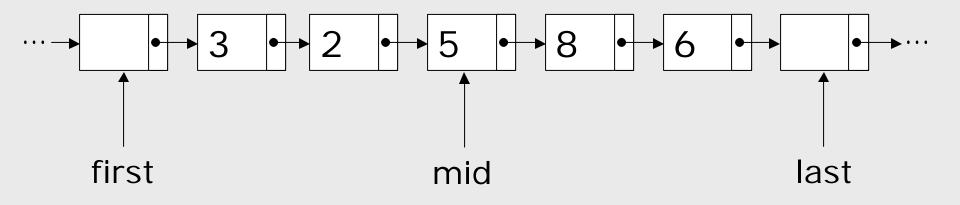
mid.val > crt.val ? No!

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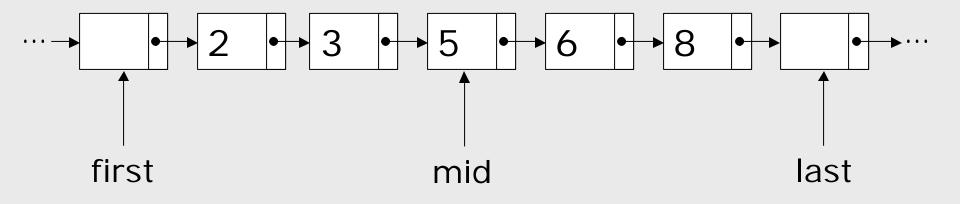


crt = prev->next

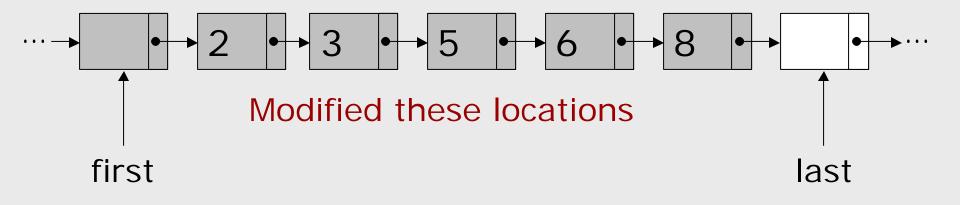
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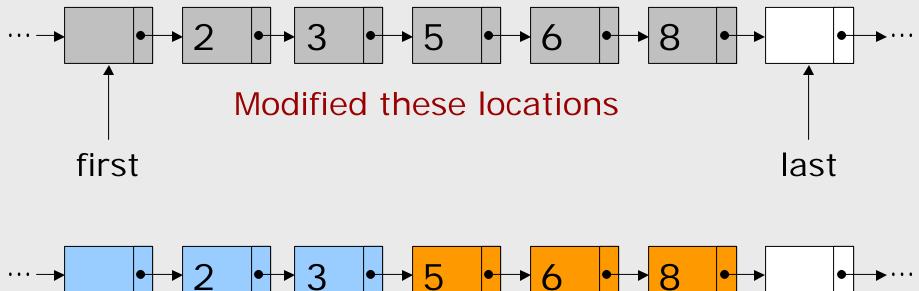
Quicksort Example: Recursing

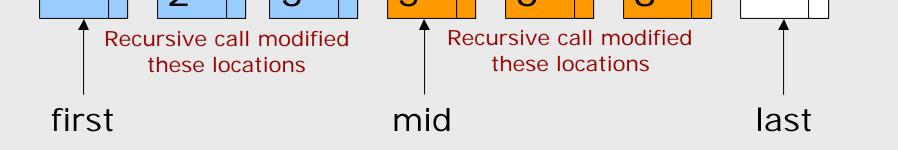


Quicksort Example: Accessed Regions



Quicksort Example: Accessed Regions





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```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
```

}

```
void quicksort(list *first, list *last) {
    list *mid, *crt, *prev;
    mid = prev = first->next;
    if (mid == last) return;
    crt = prev->next;
    if (crt == last) return;
Base cases
```

```
while (crt != last) {
    if (crt->val > mid->val) {
        prev = crt;
    } else {
        prev->next = crt->next;
        crt->next = first->next;
        first->next = crt;
    }
    crt = prev->next;
}
quicksort(first, mid);
quicksort(mid, last);
```

}

```
void quicksort(list *first, list *last) {
   list *mid, *crt, *prev;
   mid = prev = first->next;
   if (mid == last) return;
   crt = prev->next;
   if (crt == last) return;
```

```
while (crt != last) {
    if (crt->val > mid->val) {
        prev = crt;
    } else {
        prev->next = crt->next;
        crt->next = first->next;
        first->next = crt;
    }
    crt = prev->next;
```

List partitioning

quicksort(first, mid); quicksort(mid, last);

}

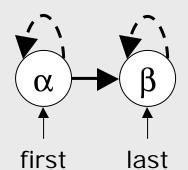
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  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
                                     Recursive calls
  quicksort(mid, last);
```

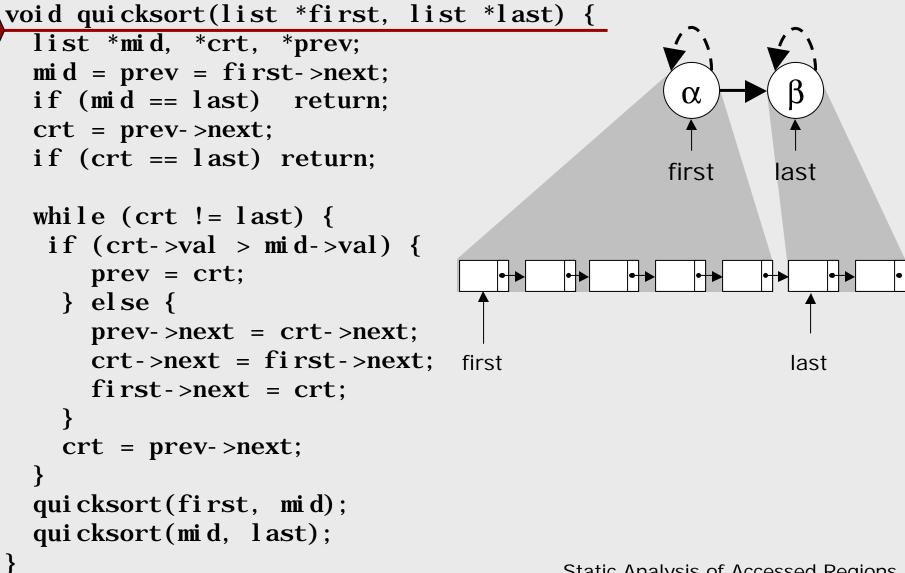
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  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
```

}

Goal: Automatically determine that the procedure accesses only the sublist between first and last.

```
void quicksort(list *first, list *last) {
 list *mid, *crt, *prev;
 mid = prev = first->next;
 if (mid == last) return;
 crt = prev->next;
 if (crt == last) return;
 while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
 }
  quicksort(first, mid);
  quicksort(mid, last);
}
```





```
void quicksort(list *first, list *last) {
 list *mid, *crt, *prev;
 mid = prev = first->next;
                                                 α
 if (mid == last) return;
 crt = prev->next;
 if (crt == last) return;
                                                first
 while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
 }
  quicksort(first, mid);
  quicksort(mid, last);
}
```

last

Effects: Reads: α Writes: α

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
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  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
```

}

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
                                  Ω
                                               α
                                                       Ω
                                         Ω
  crt = prev->next;
  if (crt == last) return;
                                 first
                                        mid
                                              prev
                                                      crt
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
                                         Ω
                                               Ω
                                                       Ω
    } else {
      prev->next = crt->next;
                                        first
                                              mid
                                                      crt
      crt->next = first->next;
                                              prev
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
}
```

Static Analysis of Accessed Regions

last

last

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
                                    Ω
                                                  Ω
                                                          Ω
                                           Ω
  crt = prev->next;
  if (crt == last) return;
                                   first
                                          mid
                                                                last
                                                prev
                                                         crt
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
                                           Ω
                                                  Ω
                                                          Ω
    } else {
      prev->next = crt->next;
                                          first
                                                         crt
                                                                last
                                                 mid
      crt->next = first->next;
                                                prev
      first->next = crt;
                                                           • •
                                                •+•
    crt = prev->next;
  quicksort(first, mid);
                                   first
                                             mid
                                                   crt
                                                             last
  quicksort(mid, last);
                                             prev
                                           Static Analysis of Accessed Regions
```

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
                                   Ω
                                                Ω
                                         Ω
  crt = prev->next;
  if (crt == last) return;
                                  first
                                        mid
                                               prev
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
                                         Ω
                                                N.
    } else {
      prev->next = crt->next;
                                        first
                                               mid
      crt->next = first->next;
                                               prev
      first->next = crt;
    }
                                                     Reads: \alpha
    crt = prev->next;
                                                     Writes: \alpha
  }
  quicksort(first, mid);
  quicksort(mid, last);
}
```

Static Analysis of Accessed Regions

last

last

crt

crt

Details of the Analysis

Outline of the Analysis

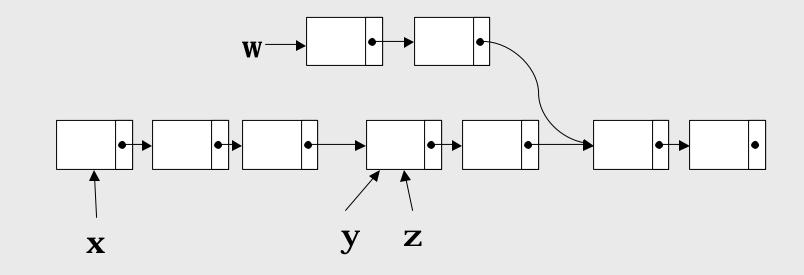
- Abstraction
- Intraprocedural Analysis
 - Shape Analysis
 - Region Analysis
- Interprocedural Analysis

Shape Abstraction

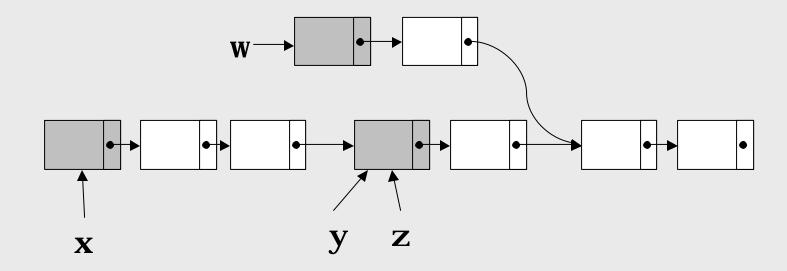
A heap is:

- an (unbounded) number of locations
- Each location may have at most one outgoing pointer
- Stack pointers point to heap locations
- Need a finite abstraction for heaps
 - Uses summary nodes to denote regions
 - Based on reachability from stack pointers

Shape Abstraction Example

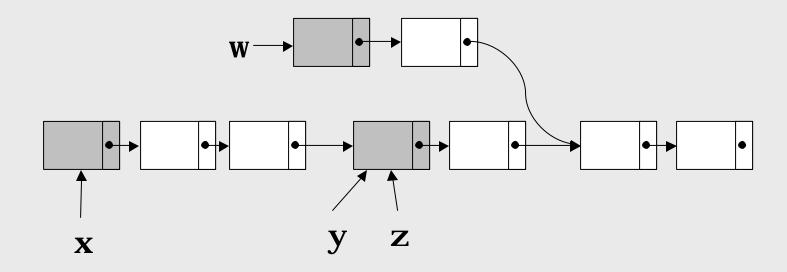


Shape Abstraction Example



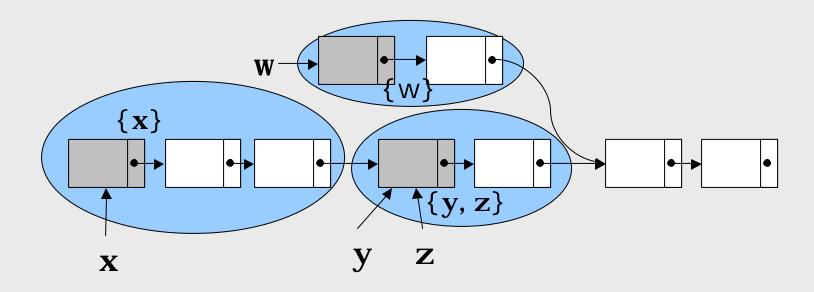
Root locations are immediately pointed to by stack pointers

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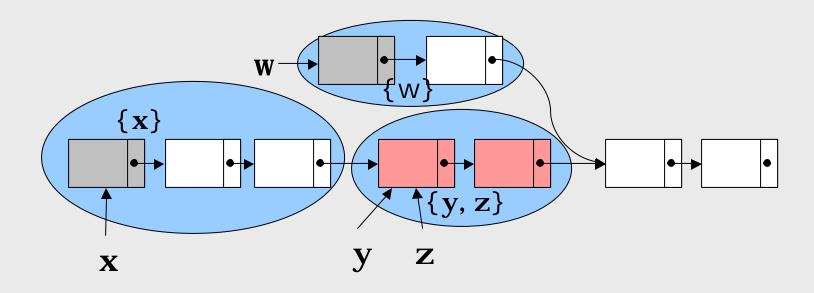
A location h is owned by a set of stack pointers S, if all paths from a stack pointer to the location h must go through the root of S

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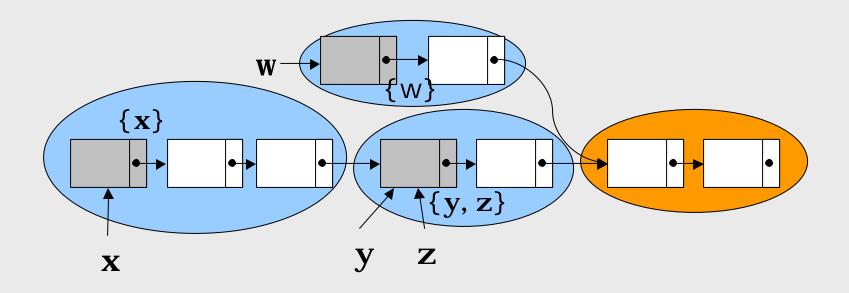
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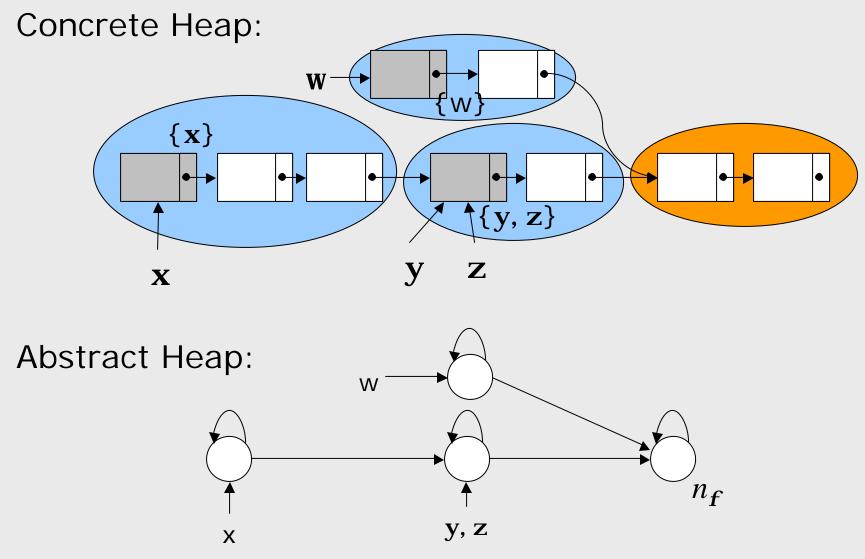
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Intraprocedural Shape Analysis

Intraprocedural Shape Analysis

- Shape Analysis is formulated as a dataflow analysis
 - Set of shape graphs computed for each program point
- A shape graph is a tuple (*N*, *E*, *C*), where:
 - N: set of summary nodes
 - $E \in N \times N \rightarrow \{0, \frac{1}{2}, 1\}$: edges with reachability info
 - $C \in N \rightarrow \{0, \frac{1}{2}, 1\}$: cyclicity info for nodes
- Transfer functions defined for x=malloc(), x=y->next , x=NULL, x->next=y , x->next=NULL, x=y
 Morgo operation defined for shape graphs
- Merge operation defined for shape graphs

Merge Operation

- $(N_1, E_1, C_1) \sqcup (N_2, E_2, C_2) = (N, E, C)$ where:
 - $\bullet \ N = N_1 \cup N_2$
 - $E(x, y) = E_1(x, y) \sqcup_3 E_2(x, y)$ if $x, y \in N_1 \cap N_2$
 - $C(x) = C_1(x) \sqcup_3 C_2(x)$ if $x \in N_1 \cap N_2$

• \sqcup_3 is the merge operation for logic values:

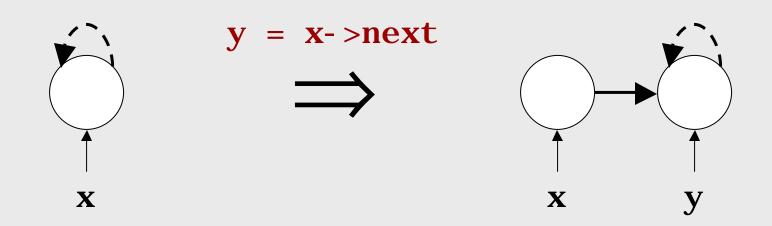
	0	1/2	1
0	0	1⁄2	1⁄2
1/2	1⁄2	1⁄2	1⁄2
1	1/2	1/2	1

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Materialization and Summarization

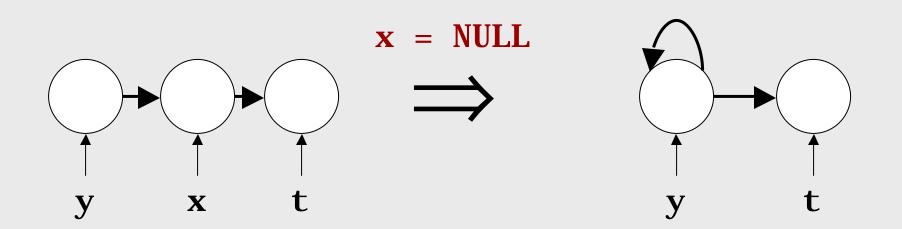
- Standard shape analysis techniques [Sagiv et al., POPL'96]
- Materialization: creating a new summary node from a summary node
 - a result of traversing a self-edge
 - E.g. y=x->next
- Summarization: combining summary nodes together
 - a result of nullifying a stack pointer
 - E.g. **x=NULL**

Materialization



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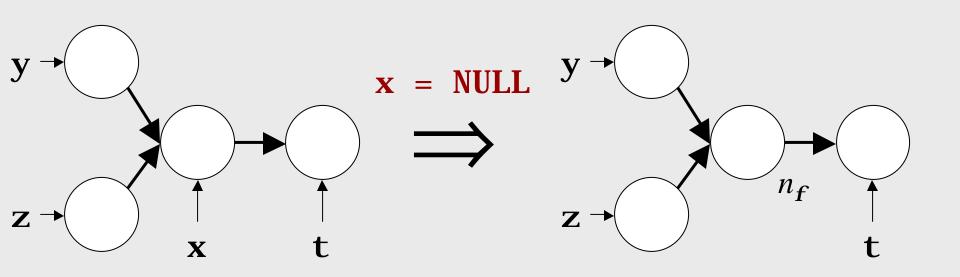
Summarization



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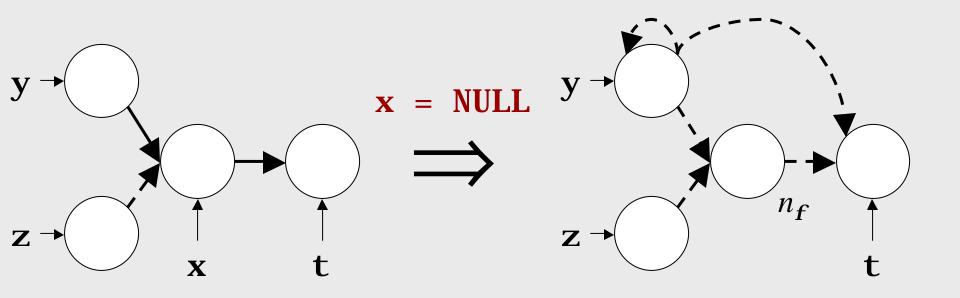
Summarization

Harder case:



Summarization

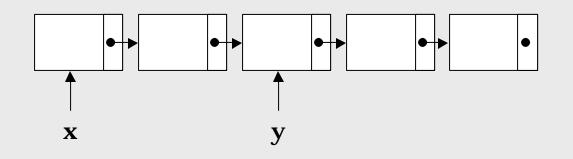
Even harder case:

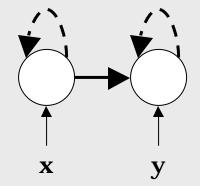


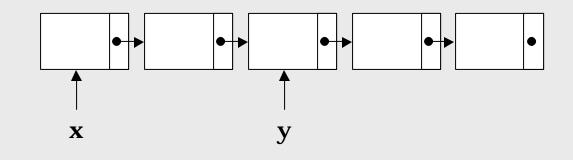
Intraprocedural Region Analysis

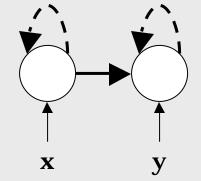
Regions

- Extend shape abstraction to analyze which regions a procedure accesses.
 - Summarize effects of procedures and express results in terms of regions
- Problem: summary nodes may represent different heap locations at different program points
 - A heap location may be owned by different stack pointers at different program points



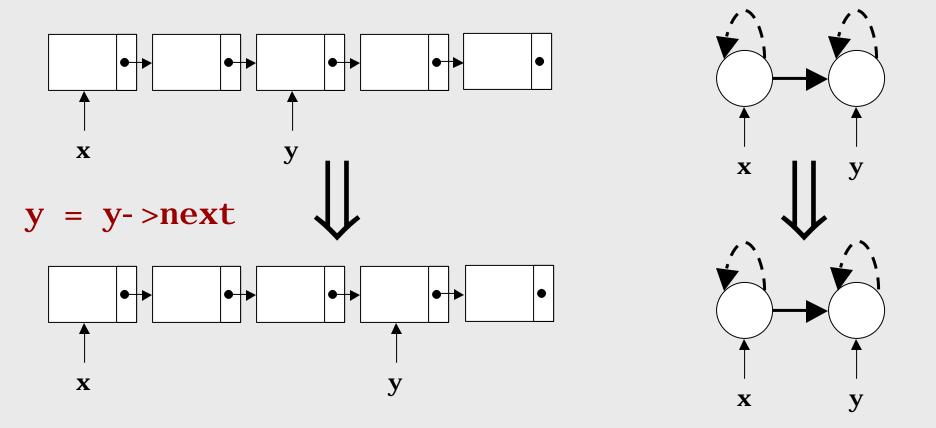




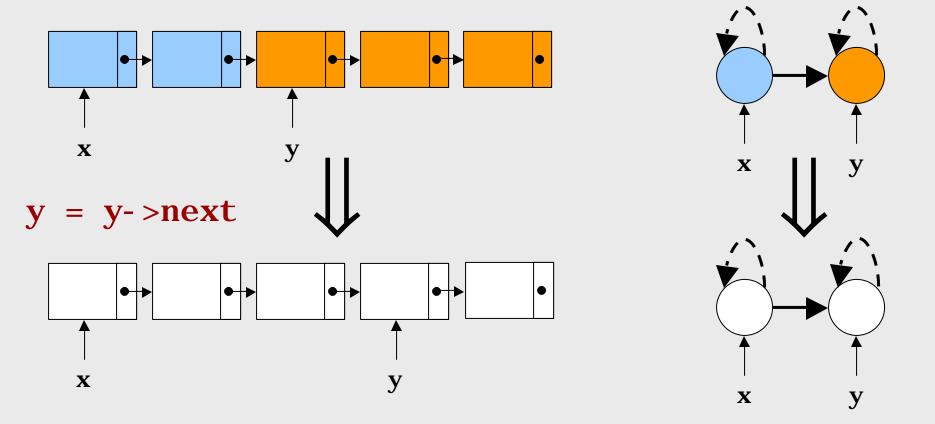


y = y - > next

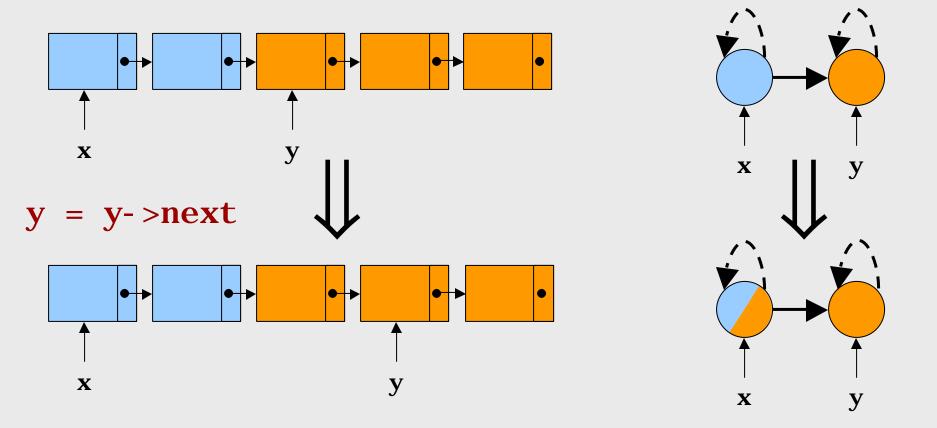
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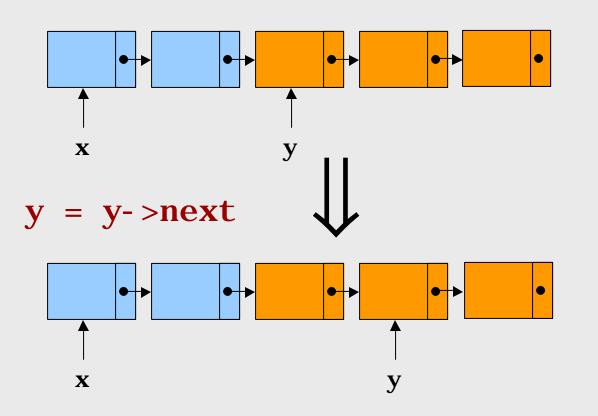


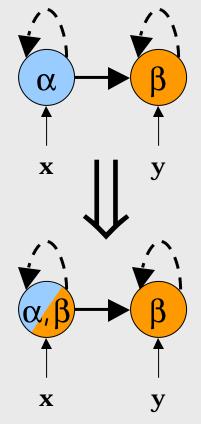
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Regions: Solution

Use labels on summary nodes to indicate the regions they represent.



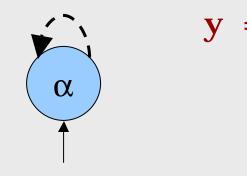


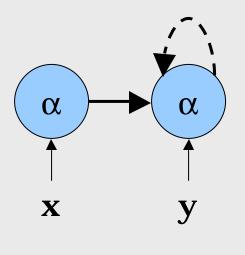
Region Analysis

- Fresh region labels are assigned at the start of a procedure, and used throughout the analysis of procedure ⇒Region labels on shape graphs refer to regions at the beginning of the procedure
- Transfer functions defined for region labels
 - Interesting cases are materialization and summarization

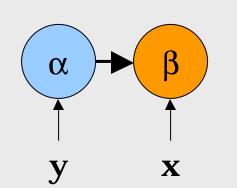
Region Analysis

Materialization



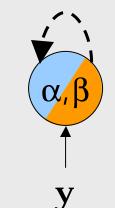


Summarization



 $\mathbf{x} = \mathrm{NULL}$

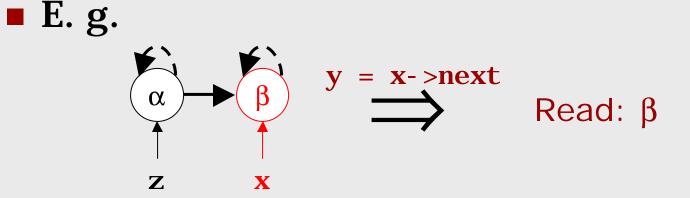
x->next



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Region Accesses

- Can use the region information to track which regions are read and written by a procedure
 - Write regions:
 - x->next=NULL, x->next=y
 - Add the region(s) for the x node to the write set
 - Read regions:
 - y=x->next
 - Add the region(s) for x node to the read set



Formal Treatment

- Transfer functions defined for all statements (including materialization and summarization cases)
- Theoretical results:
 - Termination
 - Transfer functions monotonic over a finite height lattice
 - Soundness
 - Transfer functions sound with respect to our abstraction function

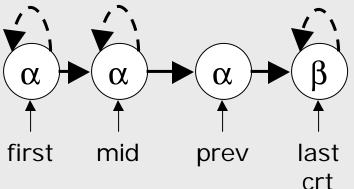
Interprocedural Analysis

Interprocedural Analysis

- Performs context-sensitive interprocedural analysis
- Can handle recursive procedures
- At each call site:
 - 1. Map current analysis information into name space of invoked procedure
 - 2. Analyze procedure for the calling context
 - 3. Unmap results

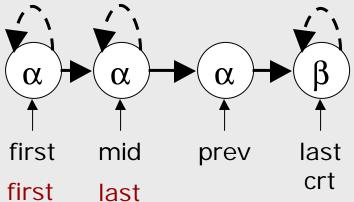
Example

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
                                       Ω
  if (crt == last) return;
                                      first
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```



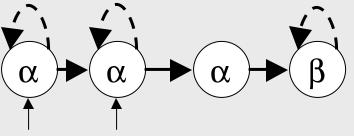
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  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```

}



```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
                                     first
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```

}



last

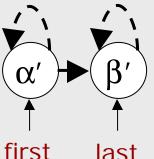
```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
                                       α
  if (crt == last) return;
                                      first
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```

}

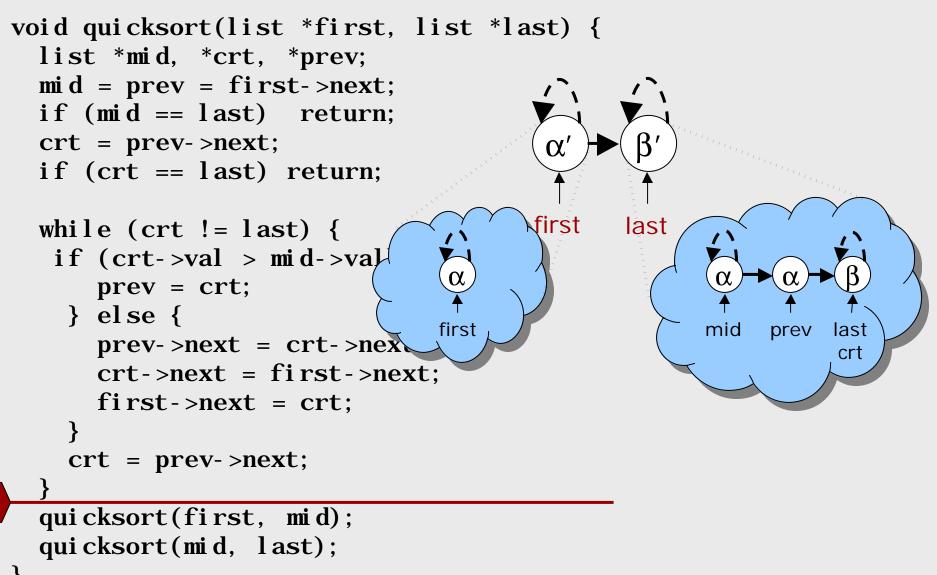
last

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
                                     first
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```

}

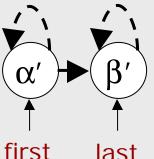


Static Analysis of Accessed Regions



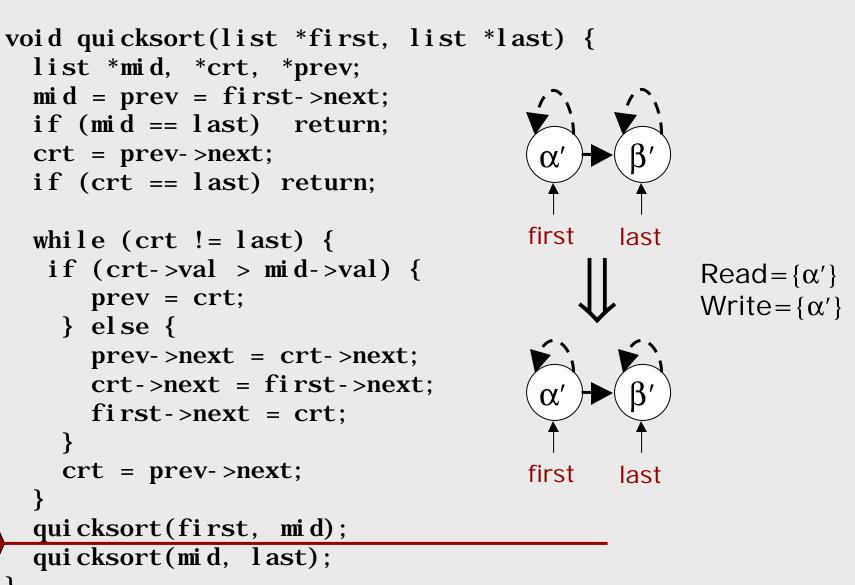
```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
                                     first
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
```

}



Static Analysis of Accessed Regions

Example: Analysis

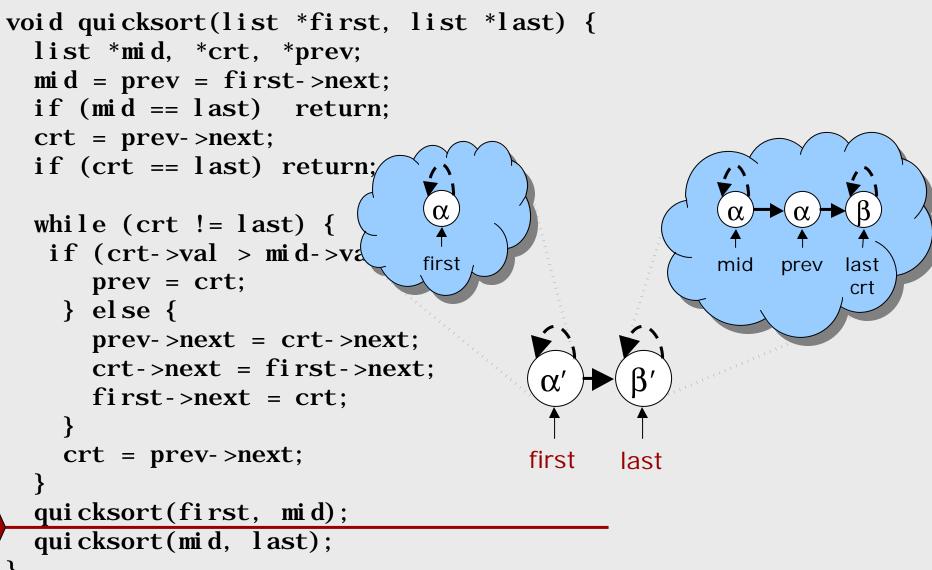


Example: Unmapping

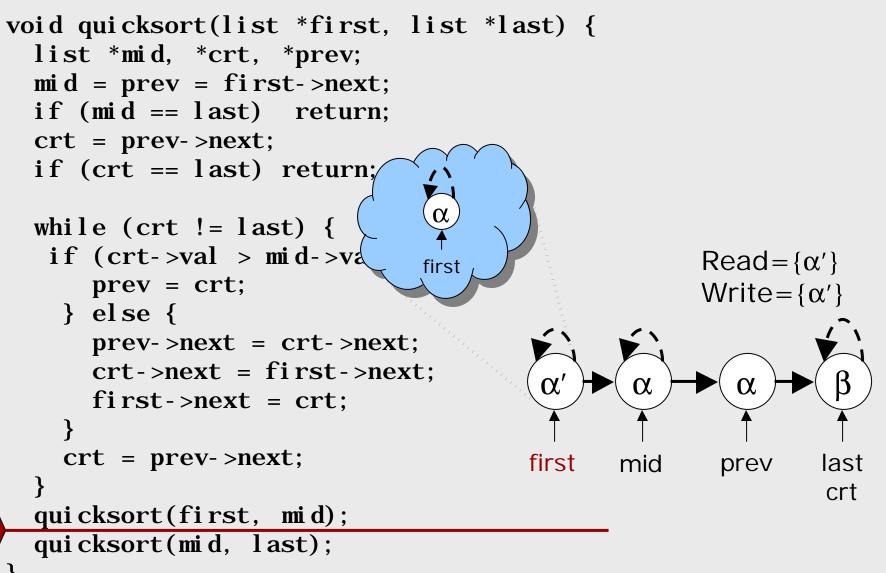
```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
                                      first
                                            last
  }
  quicksort(first, mid);
  quicksort(mid, last);
```

Read = $\{\alpha'\}$ Write = $\{\alpha'\}$

Example: Unmapping



Example: Unmapping



Example: Unmapping

```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while (crt != last) {
   if (crt->val > mid->val) {
                                                     Read = {\alpha}
      prev = crt;
                                                    Write = {\alpha}
    } else {
      prev->next = crt->next;
      crt->next = first->next;
                                         α
                                               α
                                                       α
      first->next = crt;
    }
    crt = prev->next;
                                       first
                                              mid
                                                              last
                                                      prev
  }
                                                              crt
  quicksort(first, mid);
  quicksort(mid, last);
```

Extensions

Multiple Selectors

- Extend analysis to deal with more than a single selector name:
 - Annotate edges with selector sets
 - Add cyclicity and sharedness info for selector sets

• Refining the n_f node

- n_f currently represents all heap locations not owned by any stack pointers
- Could use different shared nodes s_X (X a subset of stack pointers), that represents all heap locations reachable from all roots of pointers in X

Analysis Uses

Parallelization

Statements accessing disjoint heap regions can be executed in parallel

Program Understanding

The shape graph and region output of the analysis can aid understanding of the effect of procedures on heap structures

Correctness

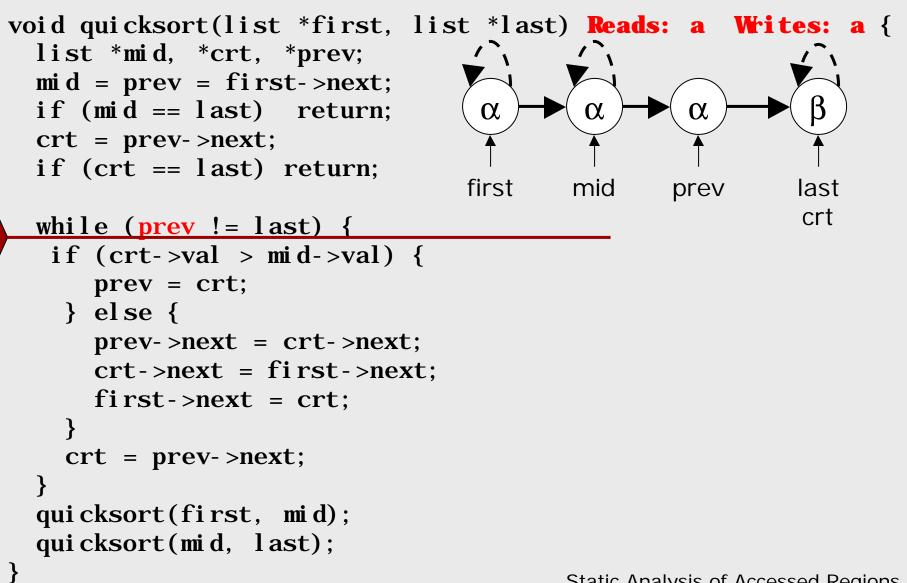
Analysis can verify programmer-supplied specifications

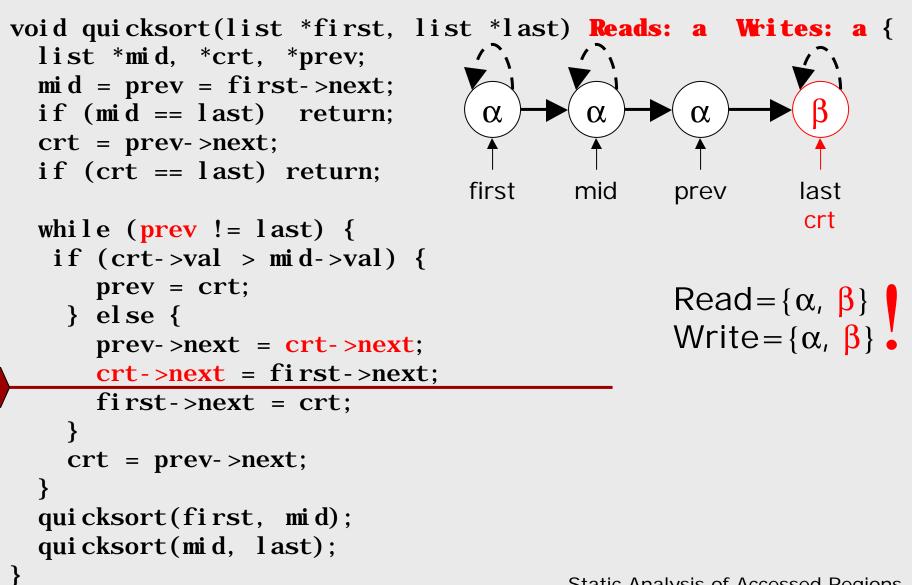
```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while ( crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
```

}

```
void quicksort(list *first, list *last) Reads: a Writes: a {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while ( crt != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
}
```

```
void quicksort(list *first, list *last) Reads: a Writes: a {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
  crt = prev->next;
  if (crt == last) return;
  while (prev != last) {
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  }
  quicksort(first, mid);
  quicksort(mid, last);
}
```





Related Work

Related Work

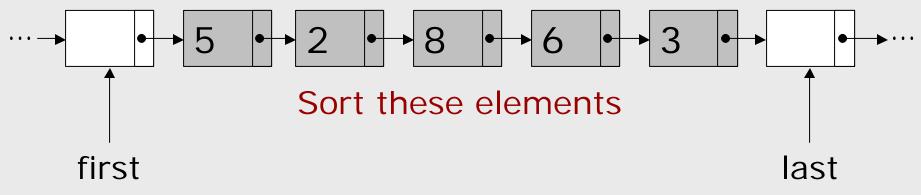
- Shape Analysis
 - [Horwitz,Pfeiffer,Reps, PLDI'89], [Chase,Wegman,Zadek,PLDI'90], [Ghiya,Hendren,POPL96], [Sagiv,Reps,Wilhelm,TOPLAS'98, TOPLAS'02], With reachability: [Dor,Rodeh,Sagiv,SAS'00]
 - Interprocedural: [Rinetzky, Sagiv, CC'01], [Kuncak, Rinard, POPL02]
- Regions
 - Language support: RC[Gay,Aiken,PLDI'98], Vault[DeLine,Fahndrich,PLDI'01], Cyclone[Grossman et.al.,PLDI'02]
 - Region Inference: [Tofte,Talpin, POPL'94], [Lattner,Adve MSP'02]

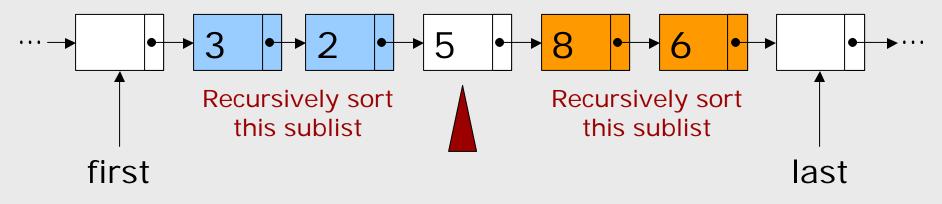
Conclusions

- Analysis of accessed regions in recursive data structures
- Regions = sublists, subtrees, etc.
- Dataflow analysis formulation
- Interprocedural analysis
- Applies to recursive programs with destructive heap updates

Quicksort Example

- Chooses a pivot value
- Partitions list into sublists destructively

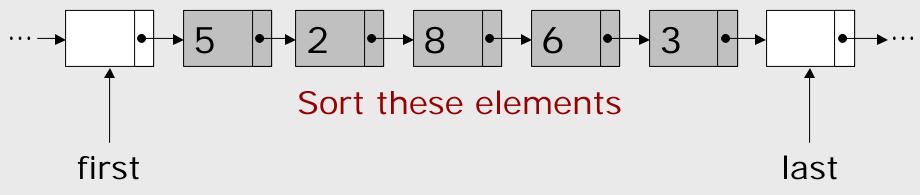


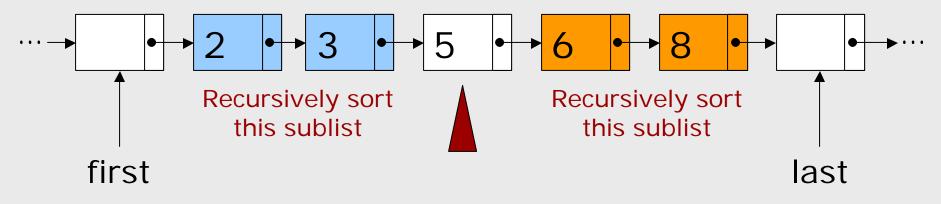


SAS'03 - June 2003

Quicksort Example

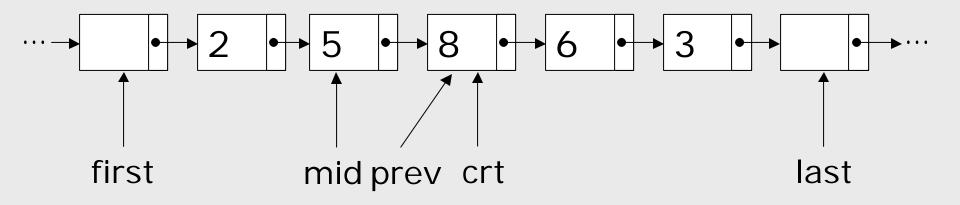
- Chooses a pivot value
- Partitions list into sublists destructively





SAS'03 - June 2003

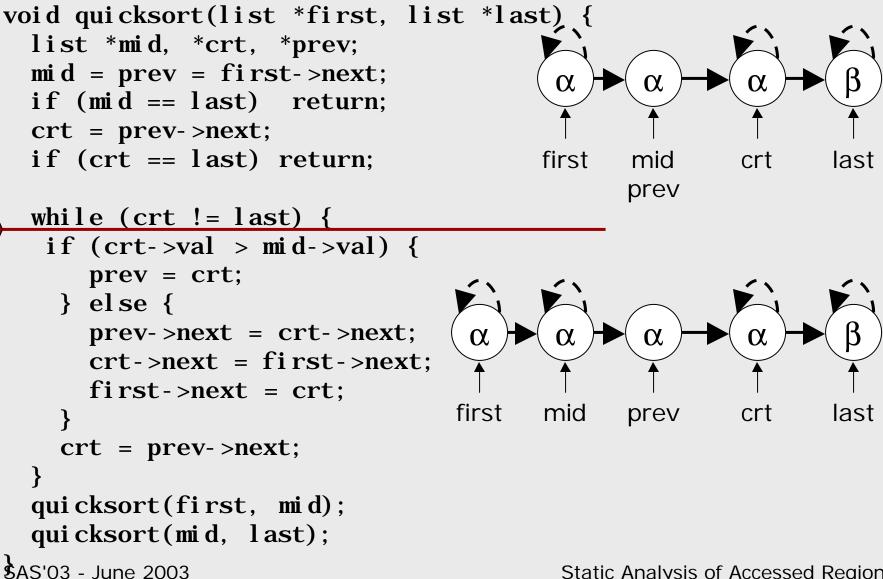
Quicksort Example: Partitioning



mid.val > crt.val ? No!

SAS'03 - June 2003

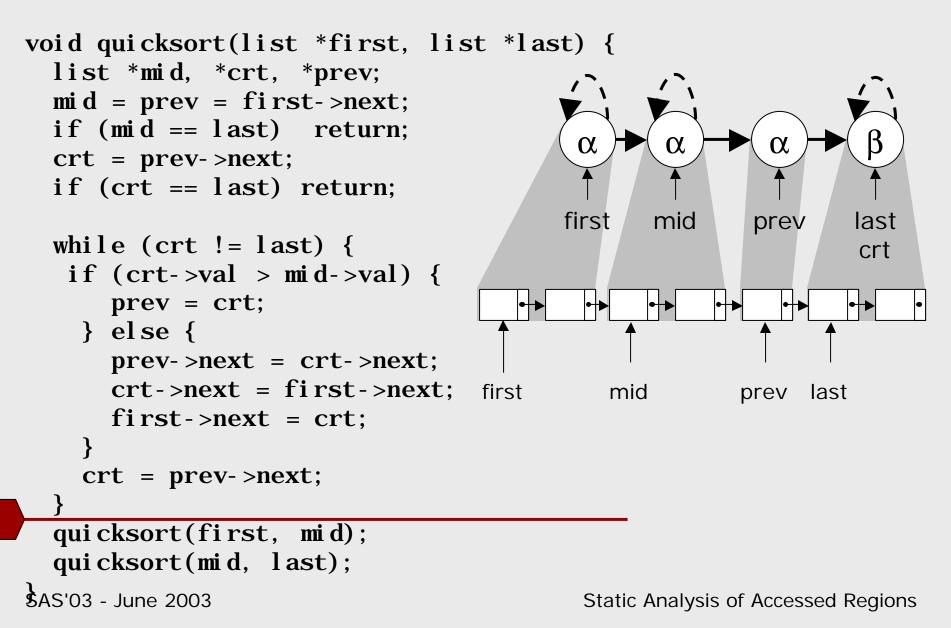
Quicksort Example: Abstraction



Quicksort Example: Abstraction

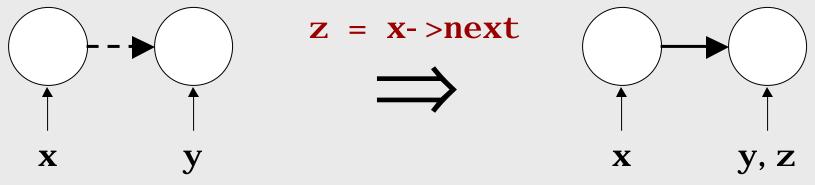
```
void quicksort(list *first, list *last) {
  list *mid, *crt, *prev;
  mid = prev = first->next;
  if (mid == last) return;
                                          α
                                                 Ω
                                                         Ω
  crt = prev->next;
  if (crt == last) return;
                                         first
                                               mid
                                                               last
                                                       prev
  while (crt != last) {
                                                               crt
   if (crt->val > mid->val) {
      prev = crt;
    } else {
      prev->next = crt->next;
      crt->next = first->next;
      first->next = crt;
    }
    crt = prev->next;
  quicksort(first, mid);
  quicksort(mid, last);
$AS'03 - June 2003
                                          Static Analysis of Accessed Regions
```

Quicksort Example: Abstraction



Traversing May-Edges

- Traversing a may-edge makes it a must-edge
 - E.g.



In any execution where z=x->next succeeds, then the root of z is definitely reachable from the root of x

Related Work

Effect Systems

- FX-87[Gifford, Jouvelot, Lucassen, POPL88],
- Broadway[Guyer,Lin,LCPC'00,SAS'03],
- Array accesses[Rugina, Rinard, CC'01],
- Cyclone[Morrisett et. al., USENIX'02],
- Roles[Kuncak, Rinard, POPL'02]