

Flow-Insensitive Pointer Analysis

Last time

- Interprocedural analysis
- Dimensions of precision (flow- and context-sensitivity)
- Flow-Sensitive Pointer Analysis

Today

- Flow-Insensitive Pointer Analysis

Flow-Insensitive Pointer Analysis

The defining characteristics

- Ignore the control-flow graph, and assume that statements can execute in any order
- Rather than producing a solution for each program point, produce a single solution that is valid for the whole program

Flow-insensitive pointer analyses

- **Andersen-style analysis:** the slowest and most precise
- **Steensgaard analysis:** the fastest and least precise
- All other flow-insensitive pointer analyses are hybrids of these two

Andersen-Style Pointer Analysis [1994]

Basic idea

- View pointer assignments as constraints
- Use these constraints to propagate points-to information

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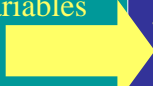
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Andersen-Style Pointer Analysis [1994]

```
void foo()  
{  
  { c = &f;  
    e = &c  
    b = a;  
    if (C) { *e = b; d = *e; a = d; }  
}
```

Derive set of constraints
on program variables



```
{ c ⊇ {f}  
  e ⊇ {c}  
  
  a ⊇ d  
  b ⊇ a  
  
  d ⊇ *e  
  *e ⊇ b
```

Goal: compute the smallest points-to sets that satisfy these constraints

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Andersen-Style Pointer Analysis

Constraint Graph

$c \supseteq \{f\}$
 $e \supseteq \{c\}$
 $a \supseteq d$
 $b \supseteq a$
 $\left\{ \begin{array}{l} d \supseteq *e \\ *e \supseteq b \end{array} \right.$

Notice that the constraint graph grows dynamically

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Andersen-Style Pointer Analysis

Constraint Graph

$c \supseteq \{f\}$
 $e \supseteq \{c\}$
 $a \supseteq d$
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 $\left\{ \begin{array}{l} d \supseteq *e \\ *e \supseteq b \end{array} \right.$

Key Point

Performance depends on

1. number of edges added
2. propagation across edges

Notice that the constraint graph grows dynamically

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Inclusion-based Pointer Analysis

Essentially

- Computes the transitive closure of a dynamic graph

Naïve algorithm doesn't scale— $O(n^3)$

- Too many edges added
- Quickly runs out of memory

Optimizations

- Cycle detection
- Location equivalence

PLDI'07

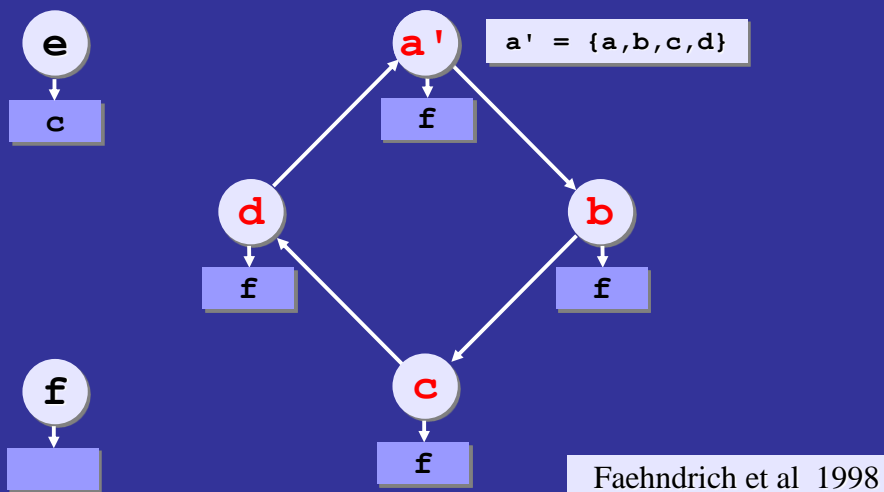
SAS'07

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Cycle Detection



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Cycle Detection

How do we detect cycles?

- They appear dynamically during the analysis
- Check for cycles too often → **Too much overhead**
- Check for cycles too infrequently → **Lost opportunities**
- Need to find a sweet spot

Two solutions [Hardekopf & Lin '07]

- Lazy Cycle Detection
- Hybrid Cycle Detection

Lazy Cycle Detection

Fact

- Cycles cause identical points-to sets

Heuristic

- Identical points-to sets indicate possible cycles
- Don't look for a cycle unless we have evidence that one might exist
- Perform cycle detection when two nodes have identical points-to sets

Result

- Faster than all previous cycle detection schemes
- See paper for details

Hybrid Cycle Detection

	few cycles	many cycles
cheap	Before the Analysis	Hybrid Cycle Detection
expensive		During the Analysis

Idea: Pre-process the constraint graph with an offline component to make the online component more efficient

Two components

- Offline component (before the analysis)
- Online component (during the analysis)

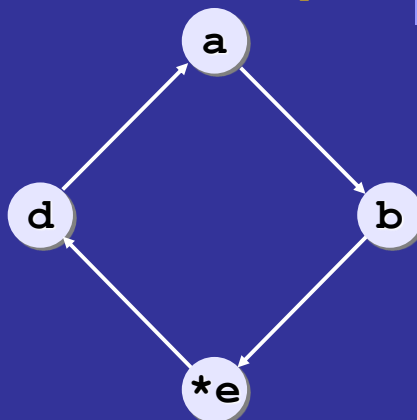
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Hybrid Cycle Detection- Offline Component

Constraint Graph



$*e \rightarrow \{a, b, d\}$

$c \supseteq \{f\}$
 $e \supseteq \{c\}$
 $a \supseteq d$
 $b \supseteq a$
 $d \supseteq *e$
 $*e \supseteq b$

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Hybrid Cycle Detection- **Online** Component

$*e \rightarrow \{a, b, d\}$

- $c \supseteq \{f\}$
- $e \supseteq \{c\}$
- $a \supseteq d$
- $b \supseteq a$
- $d \supseteq *e$
- $*e \supseteq b$

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Hybrid Cycle Detection- **Online** Component

$*e \rightarrow \{a, b, d\}$

- $c \supseteq \{f\}$
- $e \supseteq \{c\}$
- $a \supseteq d$
- $b \supseteq a$
- $d \supseteq *e$
- $*e \supseteq b$

Finds cycles at earliest possible opportunity

Never has to traverse the constraint graph

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Evaluation

Compare our work with previous state of the art

- First need to identify the state of the art

Rountev et al 2000 (OVS)

Heintze et al 2001 (HT)

Berndl et al 2003 (BLQ)

Pearce et al 2004 (PKH)

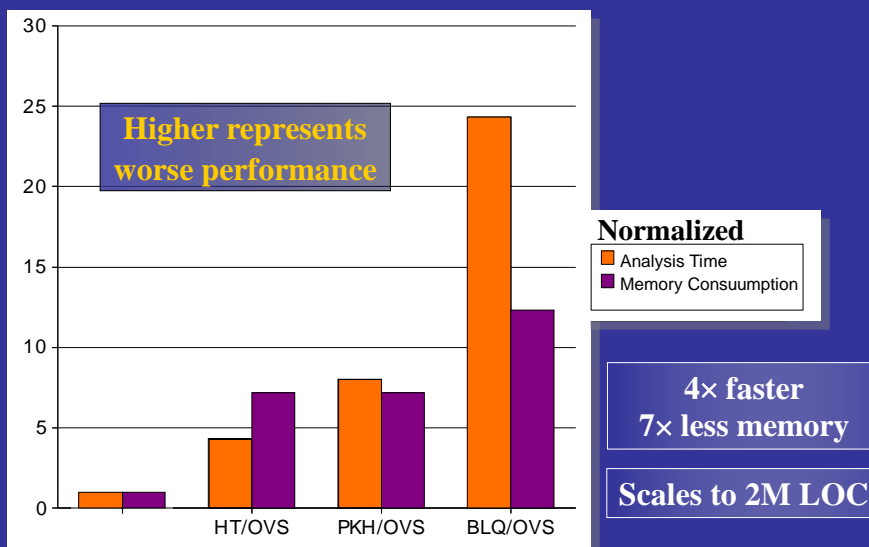
- For a fair comparison, we implement algorithms from scratch using the same infrastructure
- Compare analysis time and memory consumption on 10 C benchmarks with 100K – 2M LOC

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Evaluation



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Impact

Academic

- PLDI 2007 Best Paper Award
- Raised the bar for empirical evaluation

Industrial

- Implemented in gcc and LLVM compilers
- Implemented by Semantic Designs, Inc
 - Some of their software engineering tools can now scale to over 12M lines of C (previously stuck at 1M)

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Andersen-style Pointer Analysis – Procedure Calls

Program

```
foo(int* x){  
    . . .  
    return x;  
}
```

```
a := foo(&b)
```

Constraints

```
x  $\supseteq$  b  
a  $\supseteq$  x
```

How do we handle procedure calls?

- Insert constraints for copying actual parameters to formal parameters
- Insert constraints for copying return values

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Steensgaard Pointer Analysis [1996]

Basic idea

- Further reduce precision by using **equality constraints**
- That is, information flows both ways, rather than from the right-hand side to the left-hand side of the constraint

Tradeoffs

- Extremely imprecise
- A system of equality constraints can be solved in near-linear time
- Running time is $O(n \cdot \alpha(n))$, where $\alpha(n)$ is the inverse Ackermann's function.
- $\alpha(2^{132}) < 4$

Key idea

- The key to this algorithm is the Union-Find data structure.

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Steensgaard Pointer Analysis – Union-Find

The Union-Find data structure

- Maintains a set of disjoint sets and supports two operations:
- Find(x) : return the set containing x.
- Union(x,y) : union the two sets containing x and y.

Set Representation

- Sets are represented by a distinguished element called the **set representative**
- Each set is an inverted tree, with nodes pointing to their parents and the set representative as the root

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Steensgaard Pointer Analysis – Union-Find

Union(a, b)

- Find(a)
- Find(b)



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Steensgaard Pointer Analysis – Union-Find

Union(a, c)

- Find(a)
- Find(c)



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Steensgaard Pointer Analysis – Union-Find

Union(a, d)

- Find(a)
- Find(d)



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Union-Find Optimizations

Two key optimizations

- Path compression
- Union-by-rank
- Together these optimizations yield near-linear time operations

Path compression

- Avoid redundant searches for the set representative

Union-by-rank

- When performing the Union operation, choose the set representative based on the sizes of the two sets

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Steensgaard Pointer Analysis – Path Compression

Union(a, b)

- Find(a)
- Find(b)



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Steensgaard Pointer Analysis – Path Compression

Union(a, c)

- Find(a)
- Find(c)



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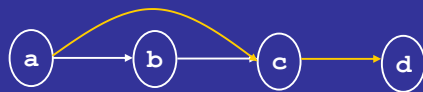
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Steensgaard Pointer Analysis – Path Compression

Union(a, d)

- Find(a)
- Find(d)



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Steensgaard Pointer Analysis – Union-by-Rank

Union(a, b)

- Find(a)
- Find(b)



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Steensgaard Pointer Analysis – Union-by-Rank

Union(a, c)

- Find(a)
- Find(c)



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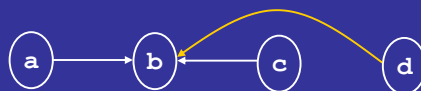
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Steensgaard Pointer Analysis – Union-by-Rank

Union(a, d)

- Find(a)
- Find(d)



What is the benefit of union-by-rank?

- It ensures that we update as few parent pointers as possible
- Consider the cost of selecting **d** as the new set representative in this last union operation

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Steensgaard Pointer Analysis – Example 1

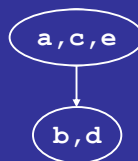
Program

```
a := &b  
c := a  
a := &d  
e := a
```

Constraints

```
a = { b, d }  
c = a  
e = a
```

Points-to Relations



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Steensgaard Pointer Analysis – the Algorithm

```
merge(x, y)  
{  
  x = Find(x); y = Find(y);  
  if (x == y) then return;  
  Union(x, y);  
  merge(points-to(x), points-to(y));  
}  
  
for each constraint LHS = RHS  
  merge(LHS, RHS)
```

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Steensgaard Pointer Analysis – Example 2

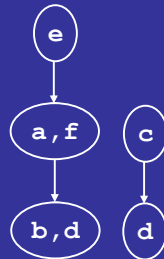
Program

```
a := &b  
c := &d  
e := &a  
f := a  
*e := c
```

Constraints

```
a = { b }  
c = { d }  
e = { a }  
f = a  
*e = c
```

Points-to Relations



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Steensgaard Pointer Analysis – Example 2

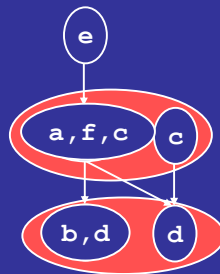
Program

```
a := &b  
c := &d  
e := &a  
f := a  
*e := c
```

Constraints

```
a = { b }  
c = { d }  
e = { a }  
f = a  
*e = c
```

Points-to Relations



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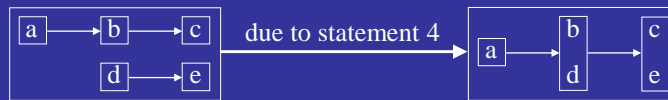
Andersen vs. Steensgaard

```
int **a, *b, c, *d, e;  
1: a = &b;  
2: b = &c;  
3: d = &e;  
4: a = &d;
```

Andersen-style analysis



Steensgaard analysis



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The Big Picture

Precision vs. Performance

- Steensgaard’s analysis and Andersen’s analysis operate on abstractions of the program text
- Instead of the CFG, they operate on sets
- These abstractions trade off precision for performance

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Concepts

Flow-insensitive pointer analysis

Andersen-style analysis

- Inclusion-based, subset-based
- Compute transitive closure of a dynamic graph
- Constraint graph
- Cycle elimination optimization

Steensgaard-style analysis

- Unification-based, equality-based
- Union-find data structure

Next Time

Lecture

- Context-Sensitive Pointer Analysis