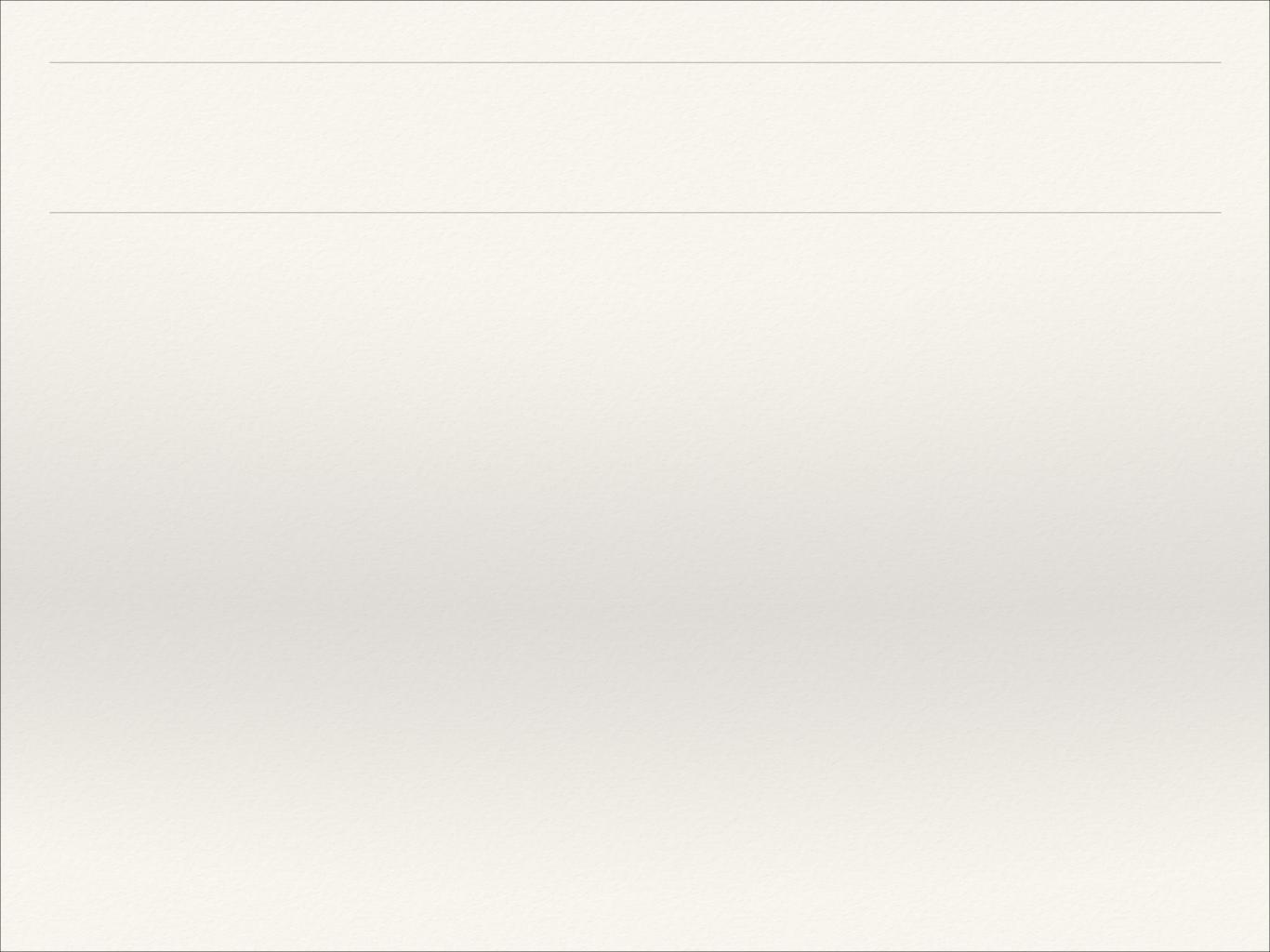
Bjarne Steensgaard

Points-to Analysis in Almost Linear Time

Presented by Abdul Dakkak



Pointer Analysis Uses

Bubble Sort

- * Declare a Point structure
- * Swap elements if two points are lexicographically less than each other
- * In main: allocate two lists and perform bubble sort on them

```
typedef struct {
  double x, y;
} Point t;
bool less(Point_t a, Point_t b) {
  return (a.x < b.x) || (a.x == b.x && a.y < b.y);
void swap(Point t * a, Point t * b) {
  Point t tmp = *a;
  *a = *b;
  *b = tmp;
void bubbleSort(Point_t *pts, int len) {
  bool swapped = true;
  while (swapped) {
    int ii = 1;
    swapped = false;
    while (ii < len) {</pre>
      Point_t * prev = &pts[ii - 1];
      Point_t * curr = &pts[ii];
      if (less(*prev, *curr)) {
        swap(prev, curr);
        swapped = true;
      ii++;
int main(void) {
 lenA = 4;
  lenB = 4;
  A = malloc(lenA);
  A = malloc(lenA);
 A = \{\{0,0\}, \{0,1\}, \{1,1\}, \{1,0\}\};
 B = \{\{1,0\}, \{1,1\}, \{0,1\}, \{0,0\}\};
  bubbleSort(A, lenA);
  bubbleSort(B, lenB);
  return 0;
```

Translating into Steensgaard's Language

- Models C language
- C pointer operations can be desugared

```
typedef struct {
                                                              less = fun(a, b) \rightarrow (res)
  double x, y;
                                                                 tmp0 = fless(a.x, b.x)
} Point t;
                                                                 tmp1 = feq(a.x, b.x)
bool less(Point t a, Point t b) {
                                                                 tmp2 = fless(a.y, b.y)
  return (a.x < b.x) || (a.x == b.x && a.y < b.y);
                                                                 tmp3 = and(tmp1, tmp2)
                                                                 res = or(tmp0, tmp3)
void swap(Point_t * a, Point_t * b) {
                                                               swap = fun(*a, *b) \rightarrow (void)
  Point_t tmp = *a;
                                                                 tmp = *a
  *a = *b;
                                                                 *a = *b
  *b = tmp;
                                                                 void = 0
void bubbleSort(Point_t *pts, int len) {
                                                              bubbleSort = fun(*pts, len) -> (void)
  bool swapped = true;
                                                                 swapped = true;
  while (swapped) {
                                                                 while (swapped) {
    int ii = 1;
                                                                   ii = 1;
    swapped = false;
                                                                   swapped = false;
    while (ii < len) {
                                                                   while (ii < len) {</pre>
      Point t * prev = &pts[ii - 1];
                                                                     ptsii_1 = add(pts, subtract(ii, 1));
      Point_t * curr = &pts[ii];
                                                                     ptsii = add(pts, ii);
      if (less(*prev, *curr)) {
                                                                     prev = &ptsii 1;
        swap(prev, curr);
                                                                     curr = &pts_ii;
        swapped = true;
                                                                     dprev = *prev;
                                                                     dcurr = *curr;
      ii++;
                                                                     if (less(dprev, dcurr)) {
                                                                       swap(prev, curr);
                                                                       swapped = true;
int main(void) {
                                                                     ii = iadd(ii, 1);
  lenA = 4;
  lenB = 4;
  A = malloc(lenA);
                                                                 void = 0
  A = malloc(lenA);
                                                              lenA = 4;
  A = \{\{0,0\}, \{0,1\}, \{1,1\}, \{1,0\}\};
                                                              lenB = 4;
  B = \{\{1,0\}, \{1,1\}, \{0,1\}, \{0,0\}\};
                                                              A = allocate(lenA);
  bubbleSort(A, lenA);
                                                              A = allocate(lenA);
  bubbleSort(B, lenB);
                                                              A = \{\{0,0\}, \{0,1\}, \{1,1\}, \{1,0\}\};
  return 0;
                                                              B = \{\{1,0\}, \{1,1\}, \{0,1\}, \{0,0\}\};
                                                              bubbleSort(A, lenA);
                                                              bubbleSort(B, lenB);
                                                               return(0);
```

Bubble Sort

- No aggregate types
- * Function variables are unique to the function
- Struct accessors flattened
- Pointer operations desugared to function calls
- * Malloc converted to allocate
- Void return converted to use a dummy variable

```
less = fun(a, b) \rightarrow (res)
  tmp0 = fless(a, b)
  tmp1 = feq(a, b)
  tmp2 = fless(a, b)
  tmp3 = and(tmp1, tmp2)
  res = or(tmp0, tmp3)
swap = fun(*a, *b) \rightarrow (void)
  tmp = *a
  *b = tmp
  void = 0
bubbleSort = fun(*pts, len) -> (void)
  swapped = true;
  while (swapped) {
    ii = 1;
    swapped = false;
    while (ii < len) {
      ptsii_1 = add(pts, subtract(ii, 1));
      ptsii = add(pts, ii);
      prev = &ptsii_1;
      curr = &pts_ii;
      dprev = *prev;
      dcurr = *curr;
      if (less(dprev, dcurr)) {
         swap(prev, curr);
         swapped = true;
      ii = iadd(ii, 1);
  void = 0
lenA = 4:
lenB = 4;
A = allocate(lenA);
A = allocate(lenA);
A = \{\{0,0\}, \{0,1\}, \{1,1\}, \{1,0\}\};
B = \{\{1,0\}, \{1,1\}, \{0,1\}, \{0,0\}\};
bubbleSort(A, lenA);
bubbleSort(B, lenB);
return(0);
```

Algorithm Outline

- * Traverse the instructions from top to bottom
- * Model values as pointers to locations or points to functions

$$* \alpha = \tau \times \lambda$$

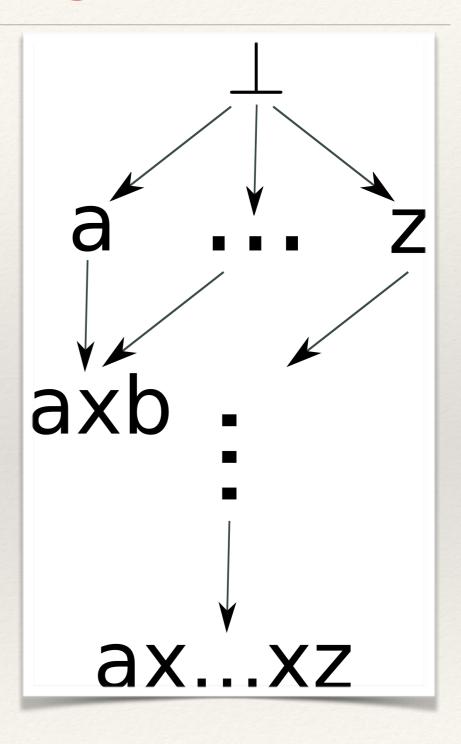
*
$$\tau = \operatorname{ref}(\alpha) \mid \bot$$

*
$$\lambda = \operatorname{lam}(\alpha_1,...)(\alpha_k,...) \mid \bot$$

* Impose partial order on memory locations

Partial Ordering

- We define a partial Ordering operator ≤
 such that
 - $(t_1 \leq t_2) \Leftrightarrow (t_1 = \bot) \lor (t_1 = t_2)$
 - $(t_1 \times t_2) \trianglelefteq (t_3 \times t_4) \Leftrightarrow (t_1 \trianglelefteq t_3) \land (t_2 \trianglelefteq t_4)$
- * Type type of each type variable is initially assumed to be $ref(\bot \times \bot)$



Use a Simpler Example

```
typedef struct {
     float x, y;
} Point t;
bool lessX(Point t * a, Point t * b) {
     return a->x < b->x:
}
Point t A[1] = \{\{0, 0\}\};
Point t B = \{0, 1\};
Point t * pC;
bool g = lessX(&A[0], &B);
if (g) {
     pC = &A[0];
} else {
     pC = \&B;
bool k = lessX(&B, &A[0]):
```

```
lessX = fun(lessa, lessb) -> (res)
     res = fpless(lessa, lessb)
v00 = 00
v01 = 01
A = allocate(8)
*A = v00
B = v01
A^* = 0A
pA0 = &A0
pB = \&B
g = lessX(pA0, pB)
if g then
     pC = &A0
else
     pC = \&B
end
k = lessX(pB, pA0)
```

```
A \vdash \mathbf{x} : \mathbf{ref}(\underline{\phantom{a}} \times \mathbf{lam}(\alpha_1 \dots \alpha_n)(\alpha_{n+1} \dots \alpha_{n+m}))
                                     A \vdash \mathsf{f}_i : \mathsf{ref}(\alpha_i)
                                  A \vdash \mathsf{r}_j : \mathsf{ref}(\alpha_{n+j})
                         \forall s \in S^* : A \vdash welltyped(s)
   A \vdash welltyped(x = fun(f_1...f_n) \rightarrow (r_1...r_m) S^*)
```

$$A \vdash \mathbf{x} : \mathbf{ref}(_ \times \mathbf{lam}(\alpha_1 \dots \alpha_n)(\alpha_{n+1} \dots \alpha_{n+m}))$$

$$A \vdash \mathbf{f}_i : \mathbf{ref}(\alpha_i)$$

$$A \vdash \mathbf{r}_j : \mathbf{ref}(\alpha_{n+j})$$

$$\forall s \in S^* : A \vdash welltyped(s)$$

$$A \vdash welltyped(\mathbf{x} = \mathbf{fun}(\mathbf{f}_1 \dots \mathbf{f}_n) \rightarrow (\mathbf{r}_1 \dots \mathbf{r}_m) S^*)$$

lessX = fun(lessa, lessb) -> (res) res = fpless(lessa, lessb)

fpless :
$$\tau_0 = \mathbf{ref}(-\times \mathbf{lam}(\alpha_1, \alpha_2)(\alpha_3))$$

lessa :
$$\tau_1 = \mathbf{ref}(\alpha_4)$$

lessb :
$$\tau_2 = \mathbf{ref}(\alpha_5)$$

res :
$$\tau_3 = \mathbf{ref}(\alpha_6) = \mathbf{ref}(\bot \times \bot)$$

less :
$$\tau_4 = \mathbf{ref}(_- \times \mathbf{lam}(\alpha_4, \alpha_5)(\alpha_6))$$

$$\alpha_4 \leq \alpha_1$$

$$\alpha_5 \leq \alpha_2$$

Constrains on the unbound types.

$$\alpha_6 \leq \alpha_3$$

One can use C's type information to know that the return type is not a pointer.

$$A \vdash x : \mathbf{ref}(\mathbf{ref}(\underline{\ }) \times \underline{\ })$$

 $A \vdash welltyped(x = allocate(y))$

$$v00 = 00$$
 $v01 = 01$
 $A = allocate(8)$
 $*A = v00$

$$A \vdash \mathbf{x} : \mathbf{ref}(\mathbf{ref}(\alpha_1) \times \underline{\hspace{1cm}})$$

$$A \vdash \mathbf{y} : \mathbf{ref}(\alpha_2)$$

$$\alpha_2 \trianglelefteq \alpha_1$$

$$A \vdash welltyped(*\mathbf{x} = \mathbf{y})$$

$$v00:\tau_5=\mathbf{ref}(\bot\times\bot)$$

$$v01:\tau_6=\mathbf{ref}(\bot\times\bot)$$

$$A:\tau_{10}=\mathbf{ref}(\mathbf{ref}(_{-})\times_{-})$$

$$A:\tau_{10}=\mathbf{ref}(\tau_5\times _{-})$$

Values are assumed to not reference anything.

Underscore matches any symbol

$$B = v01$$
 $A0 = *A$
 $pA0 = &A0$
 $pB = &B$

$$B : \tau_{11} = \tau_{6}$$
 $A0 : \tau_{12} = \tau_{5}$
 $pA0 : \tau_{13} = \mathbf{ref}(\tau_{5} \times _{-})$
 $pB : \tau_{14} = \mathbf{ref}(\tau_{6} \times _{-})$

$$A \vdash x : \mathbf{ref}(\alpha_1)$$

$$A \vdash y : \mathbf{ref}(\mathbf{ref}(\alpha_2) \times \underline{\hspace{1cm}})$$

$$\alpha_2 \trianglelefteq \alpha_1$$

$$A \vdash welltyped(x = *y)$$

$$A \vdash x : \mathbf{ref}(\tau \times \underline{\hspace{0.1cm}})$$

$$A \vdash y : \tau$$

$$A \vdash welltyped(x = \&y)$$

$$A \vdash \mathsf{x}_{j} : \mathbf{ref}(\alpha'_{n+j})$$

$$A \vdash \mathsf{p} : \mathbf{ref}(_ \times \mathbf{lam}(\alpha_{1} \dots \alpha_{n})(\alpha_{n+1} \dots \alpha_{n+m}))$$

$$A \vdash \mathsf{y}_{i} : \mathbf{ref}(\alpha'_{i})$$

$$\forall i \in [1 \dots n] : \alpha'_{i} \trianglelefteq \alpha_{i}$$

$$\forall j \in [1 \dots m] : \alpha_{n+j} \trianglelefteq \alpha'_{n+j}$$

$$A \vdash welltyped(\mathsf{x}_{1} \dots \mathsf{x}_{m} = \mathsf{p}(\mathsf{y}_{1} \dots \mathsf{y}_{n}))$$

$$g = lessX(pA0, pB)$$

$$\tau_5 \leq \alpha_4$$

$$\tau_6 \leq \alpha_5$$

Constraints from the function call.

$$g:\tau_{15}=\mathbf{ref}(\bot\times\bot)$$

if g then
$$pC = \&A0$$
 else
$$pC = \&B$$
 end

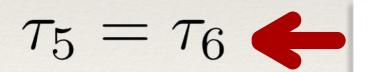
$$A \vdash x : \mathbf{ref}(\tau \times \underline{\hspace{0.1cm}})$$

$$A \vdash y : \tau$$

$$A \vdash welltyped(x = \&y)$$

pC:
$$\tau_{16} = \mathbf{ref}(\tau_5 \times \bot)$$

pC: $\tau_{16} = \mathbf{ref}(\tau_6 \times \bot)$



 $au_5 = au_6$ Equality follows from the above 2 constraints

$$A \vdash \mathsf{x}_{j} : \mathbf{ref}(\alpha'_{n+j})$$

$$A \vdash \mathsf{p} : \mathbf{ref}(_ \times \mathbf{lam}(\alpha_{1} \dots \alpha_{n})(\alpha_{n+1} \dots \alpha_{n+m}))$$

$$A \vdash \mathsf{y}_{i} : \mathbf{ref}(\alpha'_{i})$$

$$\forall i \in [1 \dots n] : \alpha'_{i} \trianglelefteq \alpha_{i}$$

$$\forall j \in [1 \dots m] : \alpha_{n+j} \trianglelefteq \alpha'_{n+j}$$

$$A \vdash welltyped(\mathsf{x}_{1} \dots \mathsf{x}_{m} = \mathsf{p}(\mathsf{y}_{1} \dots \mathsf{y}_{n}))$$

$$k = lessX(pB, pA0)$$

$$\tau_6 = \alpha_4$$

$$\tau_5 = \alpha_5$$



Why is this important?

$$g:\tau_{15}=\mathbf{ref}(\bot\times\bot)$$

Steensgaard Unifies Function Arguments

- * If $t_1 \leq C$ and $t_2 \leq C$ then $t_1 = t_2$
 - * Recall $(t \le C) \Leftrightarrow (t = \bot) \lor (t = C)$
- * This means that if we call a function with different arguments, then we will unify the arguments

```
memcpy(A, B, sz);
memcpy(B, C, sz);
memset(B, 0, sz);
strcmp(s1, s2);
strcmp(s2, s3);
```

The Point-to Set for Our Program



Why Partial Ordering Matters

$$A \vdash \mathsf{x} : \mathbf{ref}(\alpha)$$

$$A \vdash y : \mathbf{ref}(\alpha)$$

$$A \vdash welltyped(x = y)$$

$$v00 = 00$$

v01 = 01

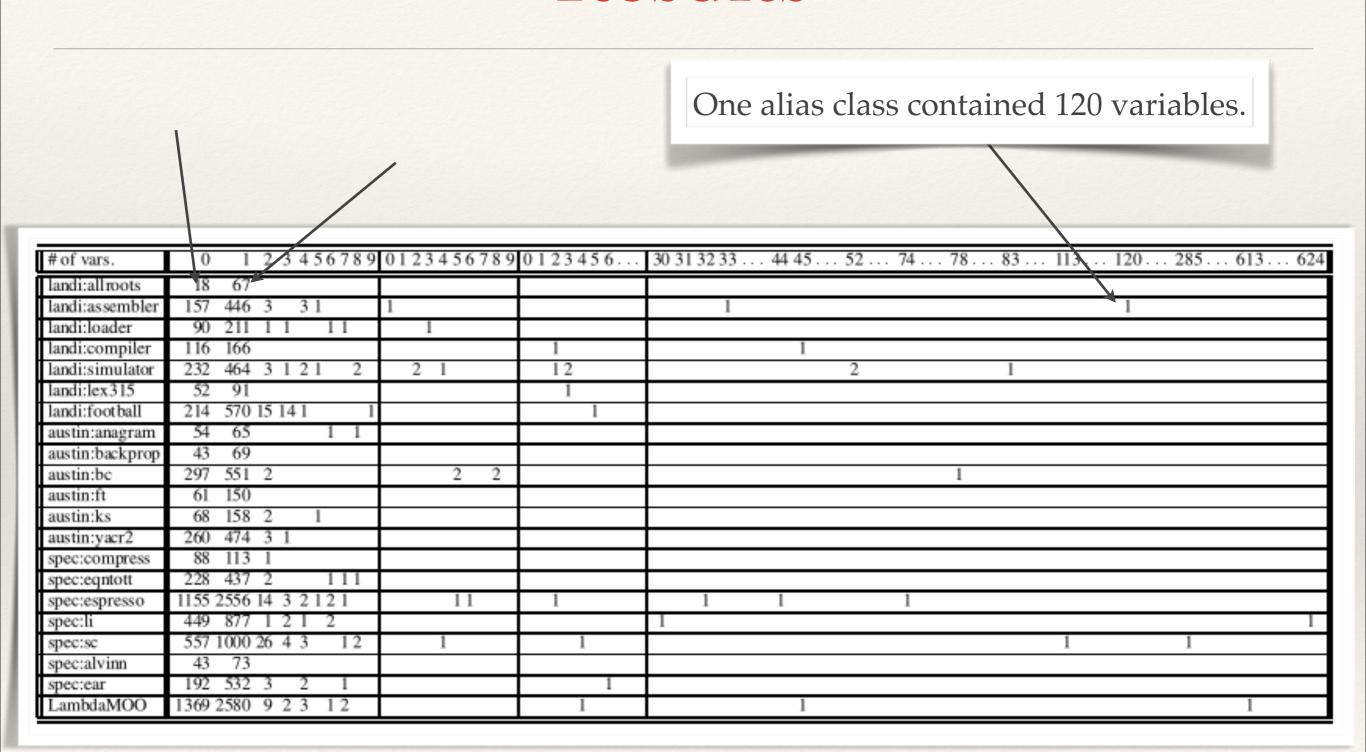


Would incorrectly alias v00 and v01

A = allocate(8)

*A = v00

Results



Author's Conclusions

Conclusion

* SSA provides some flow sensitivity for pointer analysis

Questions

Backup

Unification

* A unification algorithm finds a set of equations



Lorem Ipsum Dolor

Type Rules

Union Find Data Structure



Flow Sensitive Analysis



Context Sensitive Analysis



Field Sensitive Analysis



Object Sensitive Analysis



Heap Modeling





Point-to Analysis using Andersen



Point-to Analysis using BDD



Point-to Analysis using CFL Reachability



