Incremental Pointer and Escape Analysis

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<u>References</u>

- J. Whaley and M. Rinard. *Compositional Pointer and Escape Analysis for Java Programs.* OOPSLA 1999

- F. Vivien and M. Rinard. *Incrementalized Pointer and Escape Analysis.* PLDI 2001

[Outline](#)

- Overview

- Definitions

- Intraprocedural Analysis

- Interprocedural Analysis

- Incrementalization

- "Analysis Policy"

- Experimental Results

- Conclusion

Overview

- Analysis to generate points–to graph and escape information

- Goal: Remove synchronization and stack–allocate objects (possibly inlining first)

- Flow sensitive

- Context sensitive

- Compositional/Incremental

- Cost–based/Demand–driven

Object Representation (Graph Vertices)

- Node
  - Inside Node `x = new Foo();`
    - Thread Node `x = new Thread();`
  - Outside Node
    - Parameter Node `foo(bar p){}  return p;`
    - Load Node `x = y.f;`

- Variable
  - Local variable `foo x;`
  - Parameter variable `foo(p){}`

Points–To Edges

A points-to escape graph is a pair $\langle O, I \rangle$, where

- $O \subseteq (N \times \mathbf{F}) \times N_L$ is a set of outside edges. We write an edge $\langle \langle n_1, \mathbf{f} \rangle, n_2 \rangle$ as $n_1 \xrightarrow{\mathbf{f}} n_2$.

- $I \subseteq ((N \times \mathbf{F}) \times N) \cup (\mathbf{V} \times N)$ is a set of inside edges. We write an edge $\langle \mathbf{v}, n \rangle$ as $\mathbf{v} \to n$ and an edge $\langle \langle n_1, \mathbf{f} \rangle, n_2 \rangle$ as $n_1 \xrightarrow{\mathbf{f}} n_2$.

$e_{O,I}(n) = \{ n' \in N_T \cup N_P . n \text{ is reachable from } n' \text{ in } O \cup I \}$

- escaped($\langle O, I \rangle, n$) if $e_{O,I}(n) \neq \emptyset$

- captured($\langle O, I \rangle, n$) if $e_{O,I}(n) = \emptyset$
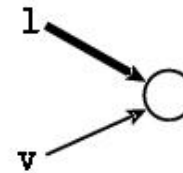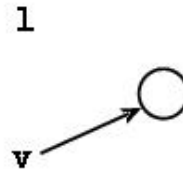
Intraprocedural Analysis

- Each method analyzed under assumption that parameters not aliased

- Edge sets initialized to

$$\langle \emptyset, \{ \langle \mathbf{v}_i, n_{\mathbf{v}_i} \rangle . 1 \le i \le n \} \rangle$$
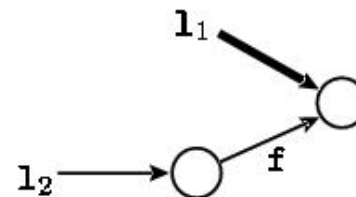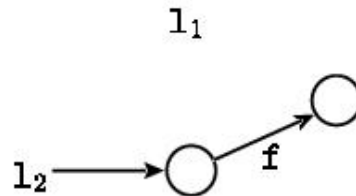
where $n_{\mathbf{v}_i}$ is the parameter node for parameter $\mathbf{v}_i$.
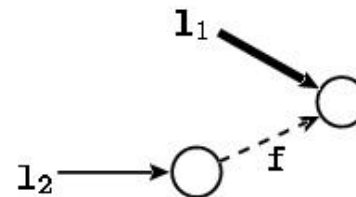
Intraprocedural Analysis

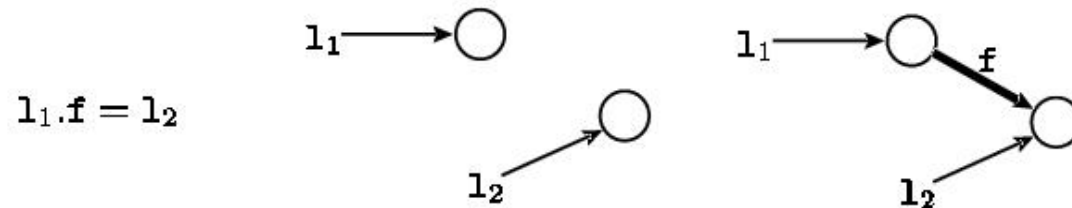$l = v$

$l_1 = l_2 . f$

$l_1 = l_2 . f$

Intraprocedural Analysis

$l_1 = l_2.f$

where ② escaped ① is the load node for $l_1 = l_2.f$

$l_1.f = l_2$

$l = new\ cl$

where ③ is the inside node for $l = new\ cl$

Intraprocedural Analysis

- Assignments to a local variable kill existing edges from the variable.

- Assignments to a field leave existing edges in place.

- At control flow merge points, union of all edges is taken.

- At end of method, all captured nodes, local, and parameter variables discarded

Interprocedural Analysis

We assume a call site of the form $l_0.op(l_1, \ldots, l_k)$, a potentially invoked method op with formal parameters $v_0, \ldots, v_k$, a points-to escape graph $\langle O_1, I_1 \rangle$ at the program point before the call site, and a graph $\langle O_2, I_2 \rangle$ from the end of op.

A map $\mu \subseteq N \times N$ combines the callee graph into the caller graph.

Interprocedural Analysis

$$\hat{\mu}(n) \subseteq \mu(n) \tag{1}$$

$$\frac{n_1 \xrightarrow{\mathbf{f}} n_2 \in O_2, \, n_3 \xrightarrow{\mathbf{f}} n_4 \in O_1 \cup I_1, \, n_1 \xrightarrow{\mu} n_3}{n_2 \xrightarrow{\mu} n_4} \tag{2}$$

$$\frac{n_1 \xrightarrow{\mu} n_3, \, n_2 \xrightarrow{\mu} n_3, \, n_1 \neq n_2,}{n_1 \xrightarrow{\mathbf{f}} n_4 \in O_2, \, n_2 \xrightarrow{\mathbf{f}} n_5 \in O_2 \cup I_2} \tag{3}$$
$$\frac{}{\mu(n_4) \subseteq \mu(n_5)}$$

$$\frac{n_1 \xrightarrow{\mathbf{f}} n_2 \in I_2, \, n_1 \xrightarrow{\mu} n, \, n_2 \in N_I}{n_2 \xrightarrow{\mu} n_2} \tag{4}$$

$$\frac{n_1 \xrightarrow{\mathbf{f}} n_2 \in O_2, \, n_1 \xrightarrow{\mu} n, \, \text{escaped}(\langle O, I \rangle, n)}{n_2 \xrightarrow{\mu} n_2} \tag{5}$$

$$\frac{n_1 \xrightarrow{\mathbf{f}} n_2 \in I_2}{(\mu(n_1) \times \{\mathbf{f}\}) \times \mu(n_2) \subseteq I} \tag{6}$$

$$\frac{n_1 \xrightarrow{\mathbf{f}} n_2 \in O_2, \, n_2 \xrightarrow{\mu} n_2}{(\mu(n_1) \times \{\mathbf{f}\}) \times \{n_2\} \subseteq O} \tag{7}$$

Interprocedural Analysis
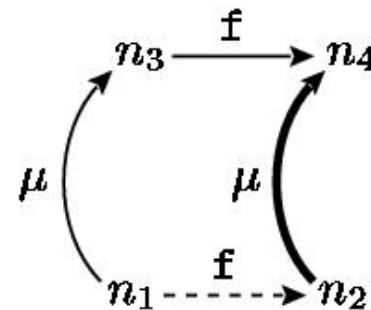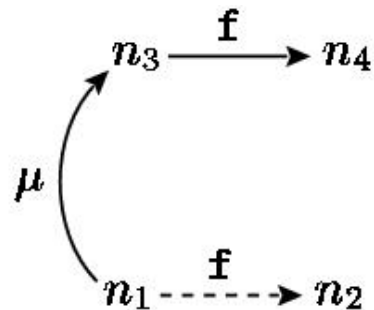
- Map actual nodes of caller to parameter nodes of callee

$$\hat{\mu}(n) = \begin{cases} I_1(\mathbf{1}_i) & \text{if } \{n\} = I_2(\mathbf{v}_i) \\ \emptyset & \text{otherwise} \end{cases}$$

$$\hat{\mu}(n) \subseteq \mu(n) \tag{1}$$

Interprocedural Analysis

- Match outside nodes and edges from callee to nodes and edges from caller

$$\frac{n_1 \xrightarrow{f} n_2 \in O_2, n_3 \xrightarrow{f} n_4 \in O_1 \cup I_1, n_1 \xrightarrow{\mu} n_3}{n_2 \xrightarrow{\mu} n_4} \quad (2)$$

Interprocedural Analysis
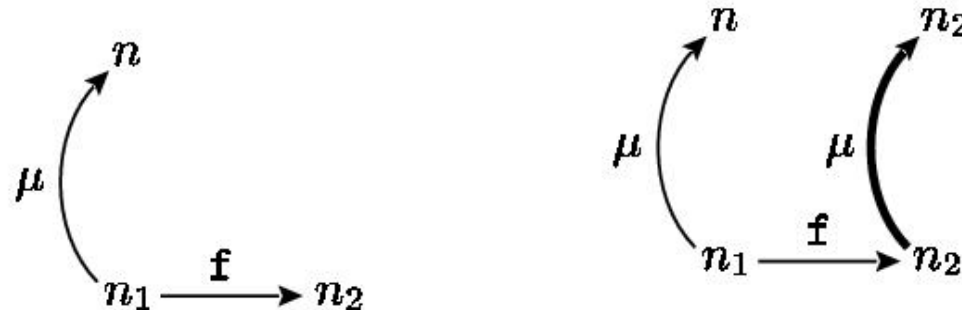
- Map aliases from caller into callee

$$\frac{n_1 \xrightarrow{\mu} n_3, n_2 \xrightarrow{\mu} n_3, n_1 \neq n_2,\quad n_1 \xrightarrow{f} n_4 \in O_2, n_2 \xrightarrow{f} n_5 \in O_2 \cup I_2}{\mu(n_4) \subseteq \mu(n_5)} \quad (3)$$

Interprocedural Analysis

- Map nodes escaping from callee into caller

$$\frac{n_1 \xrightarrow{\mathtt{f}} n_2 \in I_2,\, n_1 \xrightarrow{\mu} n,\, n_2 \in N_I}{n_2 \xrightarrow{\mu} n_2} \quad (4)$$

$$\frac{n_1 \xrightarrow{\mathtt{f}} n_2 \in O_2,\, n_1 \xrightarrow{\mu} n,\, \mathrm{escaped}(\langle O, I \rangle, n)}{n_2 \xrightarrow{\mu} n_2} \quad (5)$$
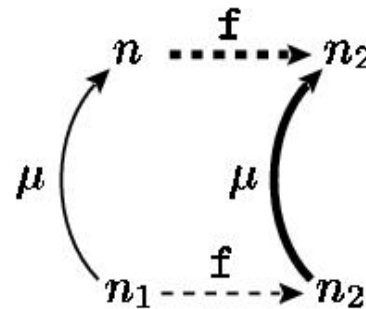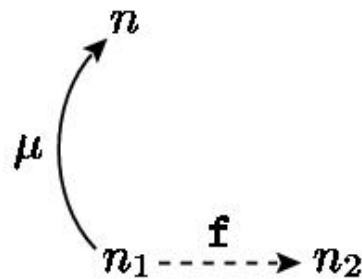
Interprocedural Analysis

- Use map to convert inside and outside edges from callee to caller

$$\frac{n_1 \xrightarrow{\mathtt{f}} n_2 \in I_2}{(\mu(n_1) \times \{\mathtt{f}\}) \times \mu(n_2) \subseteq I} \qquad (6)$$

$$\frac{n_1 \xrightarrow{\mathtt{f}} n_2 \in O_2, n_2 \xrightarrow{\mu} n_2}{(\mu(n_1) \times \{\mathtt{f}\}) \times \{n_2\} \subseteq O} \qquad (7)$$

Interprocedural Analysis

- Because of dynamic dispatch, a call site may invoke multiple target methods.

- Solution is to merge the analyses of all potential targets by taking the union of edges sets, as with an intraprocedural control flow merge.

Incrementalization

- Goal: Delay analysis of call sites
  - Produce conservative result if callee is never analyzed
  - Re–integrate result of analysis of callee into a completed analysis of caller

Incrementalization

- If the callee is never analyzed, simply consider all nodes escaping into it as permanently escaped.

- If the callee is later analyzed, the key obstacle to re–integration is flow–sensitivity.

Incrementalization

- $\omega \subseteq S \times ((N \times \{\mathbf{f}\}) \times N_L)$. For each call site s, $\omega(s) = \{n_1 \xrightarrow{\mathbf{f}} n_2.\langle s, n_1 \xrightarrow{\mathbf{f}} n_2 \rangle \in \omega\}$ is the set of outside edges that the analysis generates before it skips s.

- $\iota \subseteq S \times ((N \times \{\mathbf{f}\}) \times N)$. For each call site s, $\iota(s) = \{n_1 \xrightarrow{\mathbf{f}} n_2.\langle s, n_1 \xrightarrow{\mathbf{f}} n_2 \rangle \in \iota\}$ is the set of inside edges that the analysis generates before it skips s.

- $\tau \subseteq S \times ((N \times \{\mathbf{f}\}) \times N_L)$. For each call site s, $\tau(s) = \{n_1 \xrightarrow{\mathbf{f}} n_2.\langle s, n_1 \xrightarrow{\mathbf{f}} n_2 \rangle \in \tau\}$ is the set of outside edges that the analysis generates after it skips s.

- $\nu \subseteq S \times ((N \times \{\mathbf{f}\}) \times N)$. For each call site s, $\nu(s) = \{n_1 \xrightarrow{\mathbf{f}} n_2.\langle s, n_1 \xrightarrow{\mathbf{f}} n_2 \rangle \in \nu\}$ is the set of inside edges that the analysis generates after it skips s.

- $\beta \subseteq S \times S$. For each call site s, $\beta(s) = \{s'.\langle s, s' \rangle \in \beta\}$ is the set of call sites that the analysis skips before skipping s.

- $\alpha \subseteq S \times S$. For each call site s, $\alpha(s) = \{s'.\langle s, s' \rangle \in \alpha\}$ is the set of call sites that the analysis skips after skipping s.

Incrementalization

- When computing map to merge callee graph into caller, only use edges generated before call site.

$$\langle O, I, \mu \rangle = \mathrm{map}(\langle \omega_1(s), \iota_1(s) \rangle, \langle O_2, I_2 \rangle, \hat{\mu}_s)$$

Incrementalization

- Callee may introduce new edges into the call graph, which may in turn cause more edges to be generated.

- BUT, all such edges come from nodes escaping into callee, and therefore will be represented in caller by outside edges. We can therefore reconstruct them.
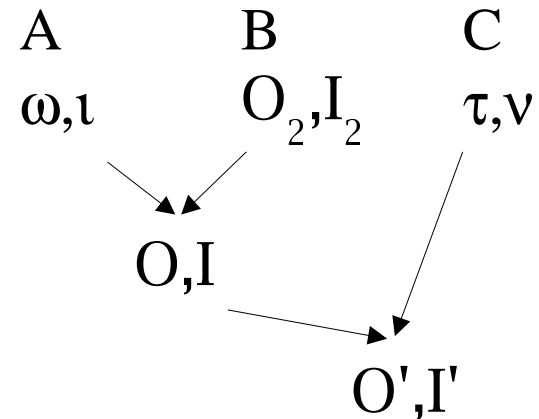
Incrementalization

- Idea: treat the part of the caller after the call site as a callee

A   B   C

ω,ι O_2,I_2 τ,ν

CodeA;   CodeA;

CallB(); $\longrightarrow$ CallB();

CodeC;   CallC();

O,I

O',I'

$$\langle O, I, \mu \rangle = \mathrm{map}(\langle \omega_1(s), \iota_1(s) \rangle, \langle O_2, I_2 \rangle, \hat{\mu}_s)$$

$$\langle O', I', \mu' \rangle = \mathrm{map}(\langle O, I \rangle, \langle \tau_1(s), \nu_1(s) \rangle, \{\langle n, n \rangle . n \in N\})$$

Incrementalization

- The analysis of a call site may add nodes to the formal parameter node mappings at a subsequent site.

- When integrating analysis result from previously skipped call site, parameter maps of all subsequent call sites must be composed with the map from the integration.

Incrementalization

- Similarly, parameter maps for skipped call sites within the callee must be composed with the map from before the original call site.

Incrementalization

- Orders must be recomputed.

$$\omega' = \omega_1 \cup \omega_2[\mu] \cup (S_2 \times \omega_1(s)) \cup (\alpha_1(s) \times O)$$
$$\iota' = \iota_1 \cup \iota_2[\mu] \cup (S_2 \times \iota_1(s)) \cup (\alpha_1(s) \times I)$$
$$\tau' = \tau_1 \cup \tau_2[\mu] \cup (S_2 \times \tau_1(s)) \cup (\beta_1(s) \times O)$$
$$\nu' = \nu_1 \cup \nu_2[\mu] \cup (S_2 \times \nu_1(s)) \cup (\beta_1(s) \times I)$$
$$\beta' = \beta_1 \cup \beta_2 \cup (S_2 \times \beta_1(s)) \cup (\alpha_1(s) \times S_2)$$
$$\alpha' = \alpha_1 \cup \alpha_2 \cup (S_2 \times \alpha_1(s)) \cup (\beta_1(s) \times S_2)$$

Here $\omega[\mu]$ is the order ω under the map μ, i.e., $\omega[\mu] = \{\langle s, n_1' \xrightarrow{f} n_2' \rangle . \langle s, n_1 \xrightarrow{f} n_2 \rangle \in \omega, n_1 \xrightarrow{\mu} n_1',$ and $n_2 \xrightarrow{\mu} n_2'\}$, and similarly for $\iota, \tau,$ and ν.

Incrementalization

- Problem: What if a call site is executed multiple times?

- Solution: Keep track of this, and if it is possible for a call site to be executed multiple times, iterate the integration of the analysis until a fixed point is reached.

Incrementalization

- Problem: Recursion.

- Solution:

  - Base analysis iterates to fixed point.

  - Incrementalized version could also.

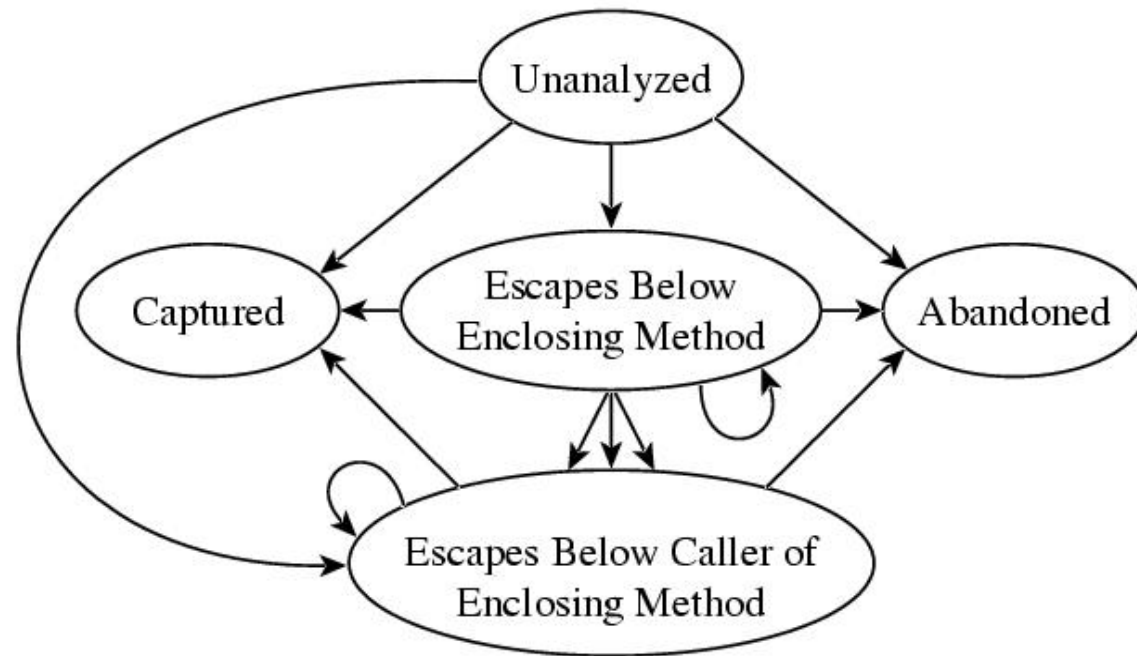 - Implementation does not iterate, leaving it to the "Analysis Policy"

Analysis Policy

- Idea: Pick an allocation site, and analyze only those methods needed to prove that it is captured.

- Trade off predicted analysis time against predicted payoff from stack–allocation

- a: candidate allocation site for analysis

- Op: method containing a

- G: current points–to escape graph for a

- p: estimated payoff (from profiling data)

- c: # of skipped call sites where a escapes
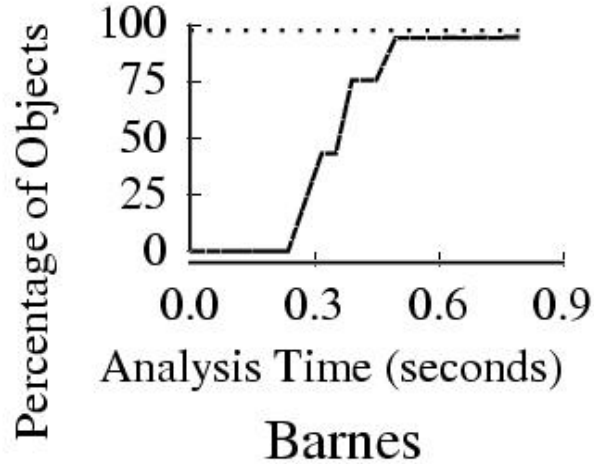
- d: call depths of analyzed region

- m: mean cost of analyses for a so far

Analysis Policy

Experimental Results

Whole: 34.3 s   Whole: 38.2 s

Experimental Results

···· Stack Allocation Percentage, Whole-Program Analysis

- - - Decided Percentage, Incrementalized Analysis

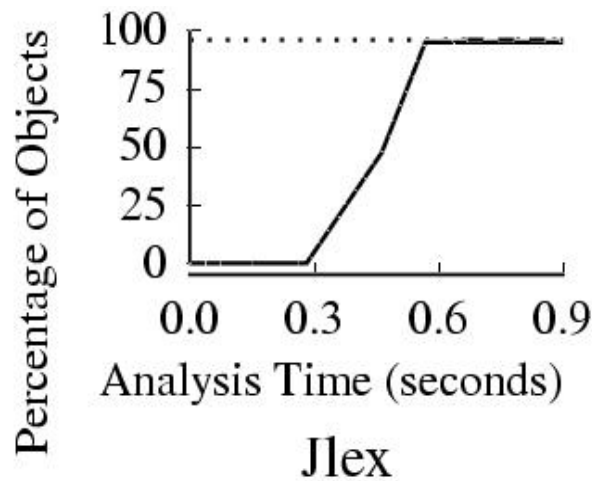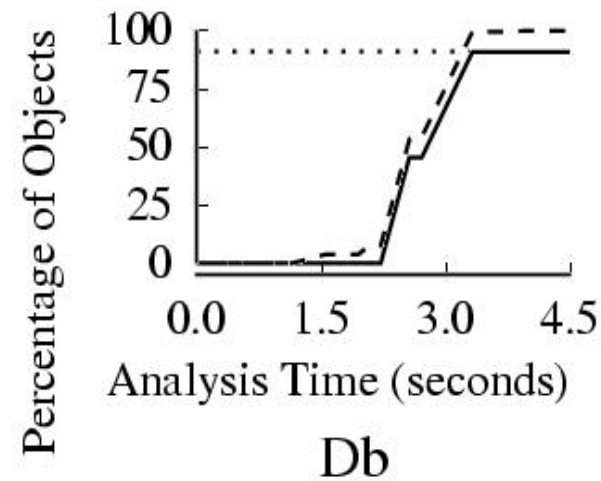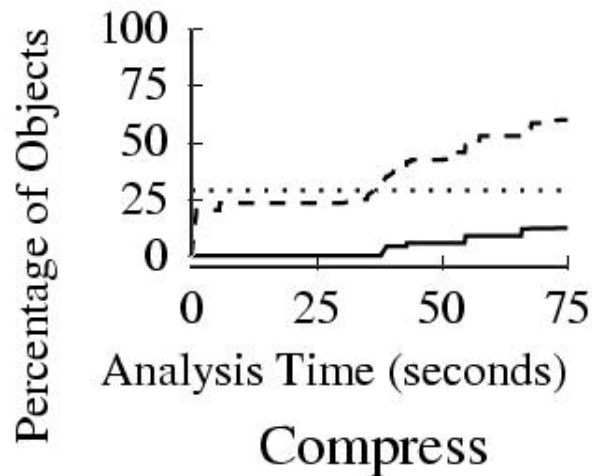—— Stack Allocation Percentage, Incrementalized Analysis

Jlex

Db

Whole: 222.8 s   Whole: 126.6
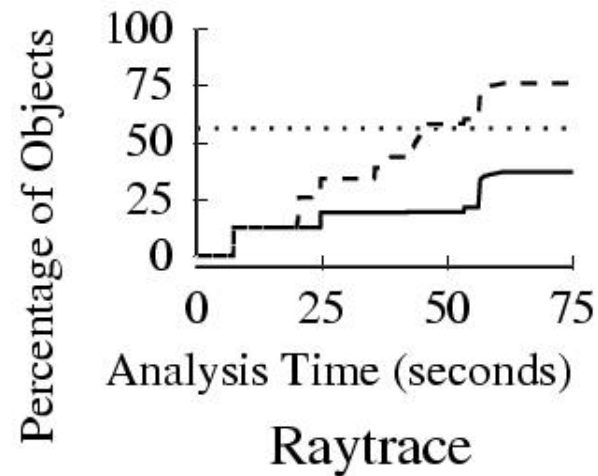
Experimental Results

Stack Allocation Percentage, Whole-Program Analysis
Decided Percentage, Incrementalized Analysis
Stack Allocation Percentage, Incrementalized Analysis

Compress

Raytrace

Whole: 645.1 s   Whole: 102.2 s

Conclusion

- Cost–directed incrementalized analysis produces results almost as accurate as a whole–program flow–sensitive analysis in significantly less time.