

# Demand-Driven Points-To Analysis For Java



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# Who needs better pointer analysis?

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## IDEs:

- for refactoring, program understanding
- but program edits invalidate analysis
- current analyses too slow to re-analyze
- incremental analyses hard to engineer

## JIT compilers:

- for virtual call resolution, register allocation
- but current analyses too slow for runtime
- plus, class loading invalidates, needs re-analysis

# What we provide

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Analysis so fast that you can

- run it in the JIT compiler
  - 16x speedup compared to Andersen's analysis
- rerun it after the code changes
  - 2ms per query about a pointer variable

Analysis with low memory overhead

- < 50 KB, eases engineering effort

Analysis with tunable precision

- adjustable to different time constraints

# Contributions

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## 1) Demand analysis with early termination:

- return conservative result after a time out

Problem we had to solve:

- how to approximate to make early termination rare?

## 2) Refining the approximation

Problems we had to solve:

- Mechanism: how to refine?
- Policy: where to focus the refinement budget?

# Outline

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- Points-to analysis background
- Our approach
  - Demand analysis
  - Early termination
- Our algorithms
  - CFL-reachability formulation
  - Approximation
  - Refinement (undoing the approximation)
- Experiments

# Points-To Analysis

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- Compute objects each variable can point to
  - For each var  $x$ , points-to set  $pt(x)$
- Andersen's Analysis: our reference point
  - Want similar precision for our analysis
  - One abstract location for each allocation site
    - $x = \text{new Foo}()$  yields  $pt(x) = \{ o1_{\text{Foo}} \}$
  - Context- and flow-insensitive
- Current implementations not suitable for us
  - Too costly for JIT, IDE
    - 30 s / 30 MB (Berndl et. al. PLDI03) on `jedit`
  - Code changes require re-analysis

# Demand-Driven Analysis

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## Protocol:

- Client asks a query: what's the points-to set of variable x?
- Analysis computes only the points-to set of x

## Works well when typically few queries:

- JIT compiler: variables in hot code
- IDE: variables in code being edited by developer

## Visits theoretically minimal set of statements

## Problem:

- worst-case time same as exhaustive
- Happens in practice for standard Andersen's

➔ Lesson: Need to approximate for scalability

- Ideally, maintain nearly all precision

# Approx: Early Termination

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Terminate queries when budget exhausted

Return a sound result to client

- early result:  $pt(x) = \{ \text{all abstract locs} \}$
- complete result:  $pt(x) = \{ o1_{Foo}, o2_{Bar} \}$

No precision loss if complete result does not satisfy client

Hypothesis: long-running ) unsatisfying

- Suggested previously (Heintze / Tardieu PLDI01)
- For standard Andersen's, large precision loss

Challenge: how to approximate further?



# Key Ideas

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Formulate analysis in CFL-reachability

- Natural for demand-driven analysis
- Andersen's for Java is balanced parens

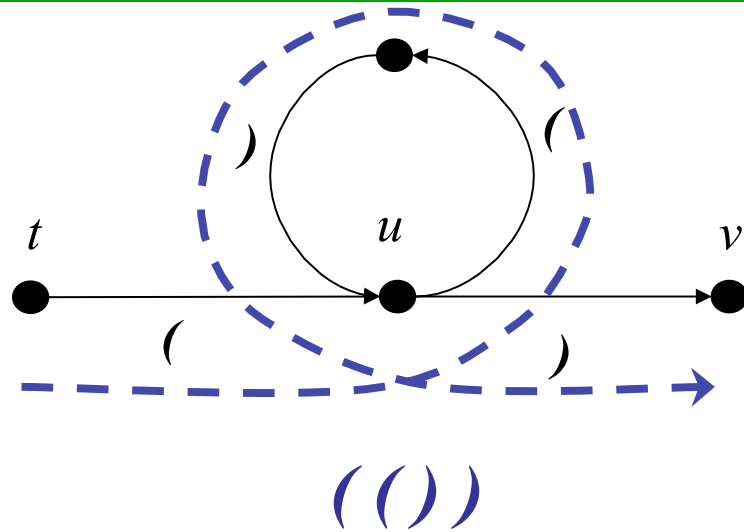
Approximate through regularization

- Solvable by linear DFS algorithm

Iterative refinement to de-approximate

- Simple recursive queries
- Client-driven

# CFL-Reachability



$S \mid SS \mid (S) \mid \varepsilon$

Points-to analysis graph:

- Nodes represent variables / locs
- Edges represent statements

Points-to analysis paths:

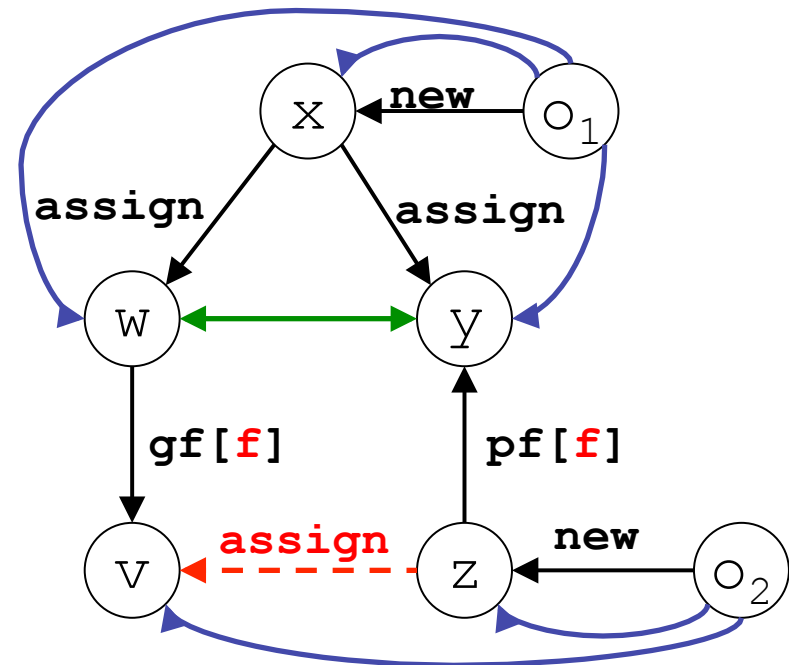
- $o \in \text{pt}(x)$ , *flowsTo*-path from  $o$  to  $x$
- $\text{pt}(x) \cap \text{pt}(y) \neq \emptyset$ ; , *alias*-path from  $x$  to  $y$

# Andersen's Analysis in CFL-Reachability

```

x = new Obj(); // o1
z = new Obj(); // o2
w = x;
y = x;
y.f = z;
v = w.f;
    
```

Edge types  
statement  
flowsTo  
alias



**flowsTo ! new ((assign)\* alias gf[f] | assign)\***  
balanced parens

Field-sensitive formulation: standard for Java

See paper for **alias** grammar

# Approx: Regularization

Add match edges for matching field read/write pairs

- From source of putfield
- To sink of getfield

Regular grammar

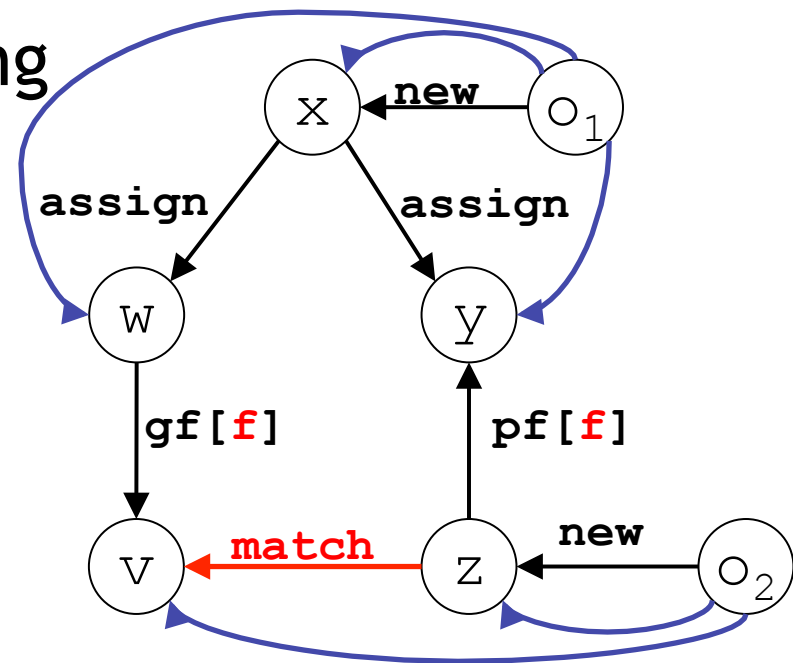
- Yields DFS algorithm

Field-based precision

`flowsToReg new (pf [(match as assign) * assign] * assign)`

`pf[f] alias gf[f] ) match`

`o flowsTo x ) o flowsToReg x`



# RegularPT

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marked, worklist: Set of Node

**procedure** query(source: Node)

  add source to marked and worklist

**while** (worklist is non-empty) **do**

    remove w from worklist

**foreach** NEW edge o -> w **do**

      add o to points-to set of source

**end**

**foreach** ASSIGN and MATCH edge y -> w **do**

      if y unmarked, add y to marked and worklist

**end**

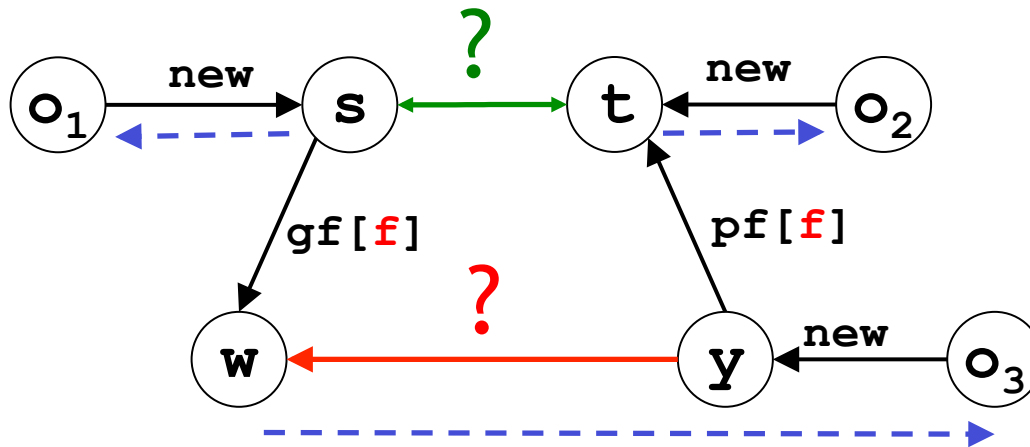
**end**

**end**

- No caching, so very low memory usage
- Early termination through traversal budget

# Refining Match Edges

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**match**  $\frac{1}{4}$  **pf**[f] **alias** **gf**[f]

Most approximation can be refined

- Imprecise for recursive fields

# Client-Driven Refinement Policy

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Not clear when / where to refine

- Extra queries may be costly
- Refining match edge may not affect result

Client-driven: only refine when client affected

- E.g, multiple targets for virtual call
- Guyer and Lin SAS03

RefinedRegularPT:

- Refine edges traversed by RegularPT
- Iterate until client satisfied or budget exhausted

# Experimental Hypotheses

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## 1) Algorithms precise with early termination

- Regular approximation reasonable
- Refinement yields improved precision

## 2) Algorithms meet performance goals

- Fast running time
- Low memory



# Evaluation Framework

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Implemented in Soot / SPARK framework

Benchmarks: SPEC, Ashes, `jedit`

Clients

- IDE: Virtual call resolution
  - For program understanding
- JIT: queries from hot code
  - Virtual call resolution (for inlining)
  - Local aliasing (for load/store elimination)

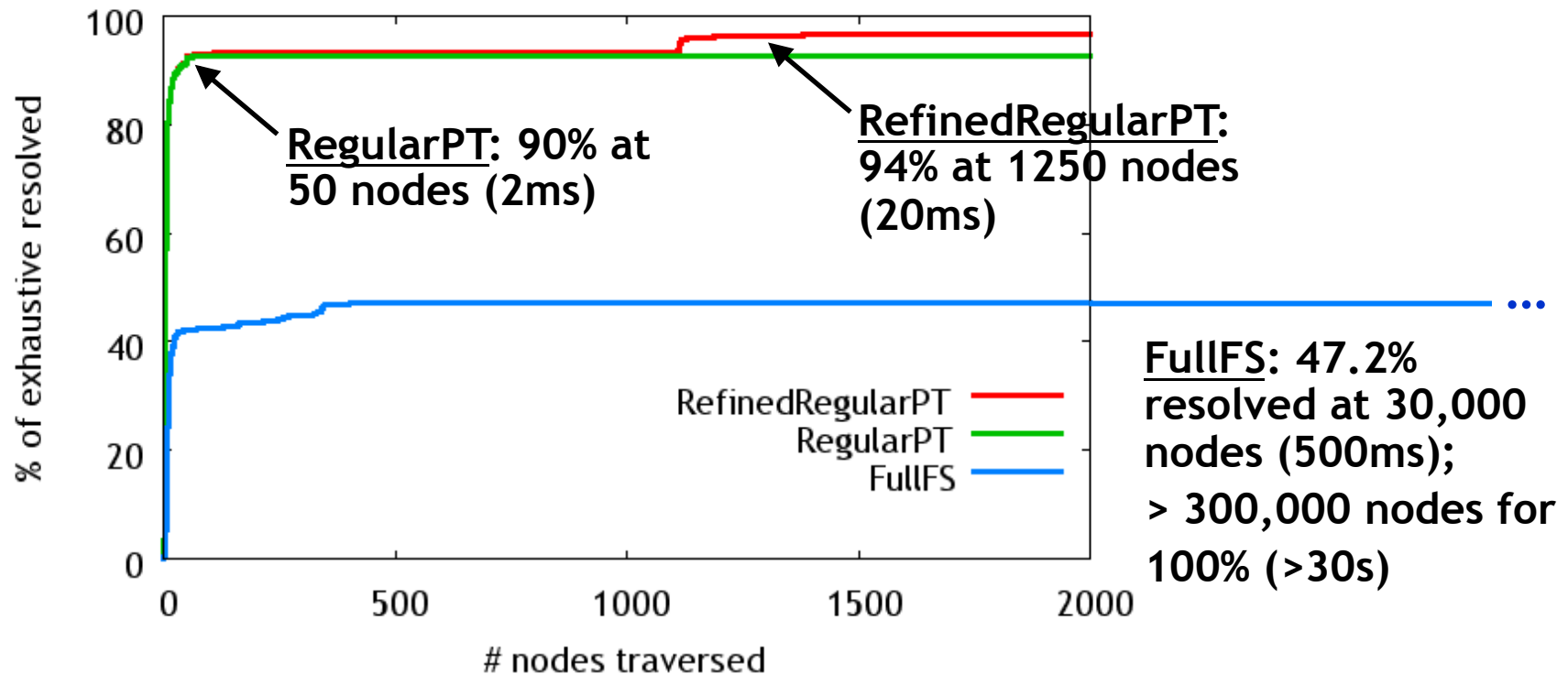
# Algorithms

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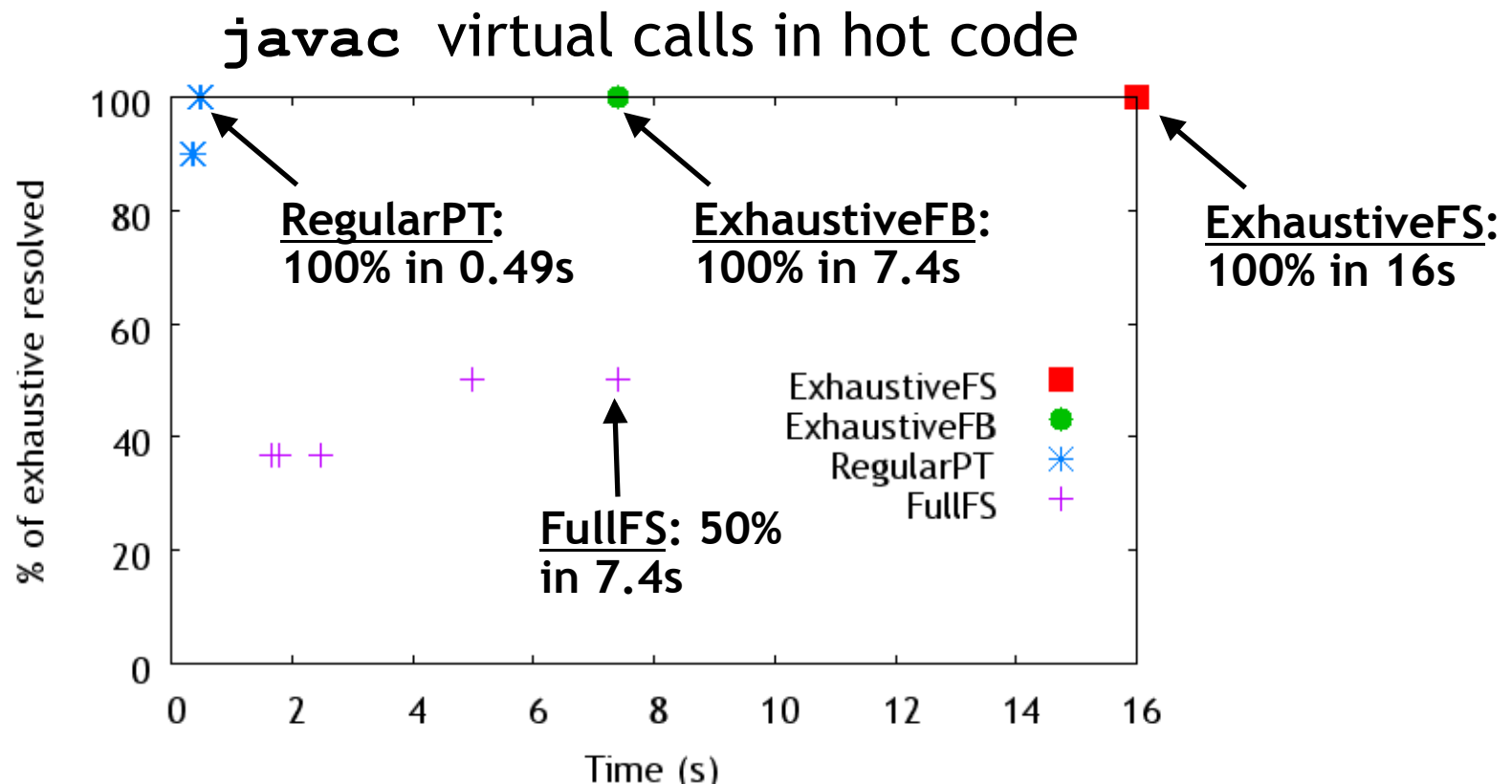
Name	Field-based / sensitive	Demand / Exhaustive	Notes
RegularPT	Field-based	Demand	DFS Traversal
RefinedRegularPT	Variable up to partially field-sensitive	Demand	Client-driven refinement
FullFS	Field-sensitive	Demand	Heintze and Tardieu [PLDI01] adapted to Java
ExhaustiveFB	Field-based	Exhaustive	from SPARK
ExhaustiveFS	Field-sensitive	Exhaustive	from SPARK

# 1) Evaluation: Precision

`jedit` virtual calls



## 2) Evaluation: Performance



### Memory:

- < 50 KB for (Refined)RegularPT
- 28MB for FullFS using BDDs

# Conclusions

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## New demand points-to analysis

- Speed through two approximations
  - Early termination
  - Regularization
- Refinement driven by client

Provide high precision in tight budget

Suitable for JITs, IDEs; and elsewhere?