

# Compare Less, Defer More

Scaling Value-Contexts Based Whole-Program Heap Analyses

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CC 2019



- Any analysis that statically approximates information about the runtime heap of a program.
- Usually involves points-to information: which variables may point to which heap locations.
- Examples: (Thread-)escape analysis, shape analysis, interprocedural control-flow analysis.

Analyze a method in each different context from which it is called.

- Call-string based
- Object-sensitive
- Type-sensitive

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Compared to context-*insensitive* analyses:

- Usually more **precise**
- Usually **unscalable**

# Call-string based context-sensitivity

```
1. class A {
2.     A f1,f2;
3.     void foo(){
4.         ...
5.         c.bar(a);
6.         d.bar(b);
7.     }
8.     void bar(A p){
9.         A x = new A();
10.        p.f1.f2 = x;
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13.    }
14.    void fb(){...}
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- 2 contexts for bar
  - foo\_5
  - foo\_6

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- 2 contexts for bar
  - foo\_5
  - foo\_6
- 4 contexts for fb
  - foo\_5+bar\_11
  - foo\_5+bar\_12
  - foo\_6+bar\_11
  - foo\_6+bar\_12



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- 2 contexts for bar
  - foo\_5
  - foo\_6
- 4 contexts for fb
  - foo\_5+bar\_11
  - foo\_5+bar\_12
  - foo\_6+bar\_11
  - foo\_6+bar\_12
- In case of recursion?

- Contexts defined in terms of data-flow values at call-sites.

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<sup>1</sup>Uday P. Khedker and Bageshri Karkare. Efficiency, Precision, Simplicity, and Generality in Interprocedural Data Flow Analysis: Resurrecting the Classical Call Strings Method. *CC 2008*.

- Contexts defined in terms of data-flow values at call-sites.
- If the lattice of data-flow values is finite, termination is guaranteed.
- Restrict the unbounded length of call-strings without sacrificing precision.

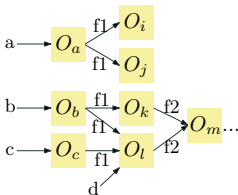
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## Value-contexts: Example

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13.  }  
14.  void fb(){...}  
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```

### Points-to graph

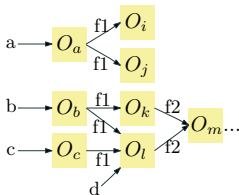


(Line 5)

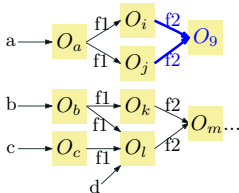
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## Points-to graph



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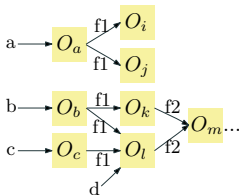


(Line 6)

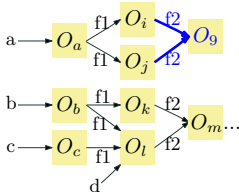
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## Points-to graph

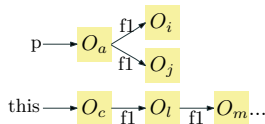


(Line 5)



(Line 6)

## Value-context

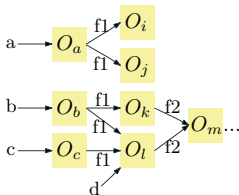


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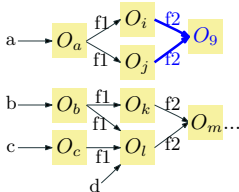
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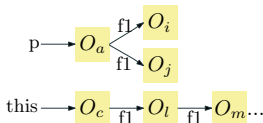


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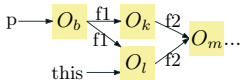


(Line 6)

## Value-context



(Line 5)



(Line 6)

- We tried using value-contexts to perform whole-program escape analysis for widely used Java benchmarks.

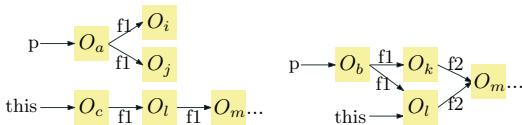


- We tried using value-contexts to perform whole-program escape analysis for widely used Java benchmarks.
- For moldyn (the smallest benchmark):
  - Analysis **did not terminate** in 3 hours!
  - Memory consumed at that time: **373 GB!**

# Problems with value-contexts

# Problem 1: Too much comparison

```
1. class A {
2.   A f1,f2;
3.   void foo(){
4.     ...
5.     c.bar(a);
6.     d.bar(b);
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Graph isomorphism is costly (NP).

## Insight 1: Relevance

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- The points-to graph reachable only till `p.f1` is *relevant* for `bar` (rest is not *accessed*).

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- **Proposal:**  
Identify and use **relevant value-contexts**.

# Insight 1: Example

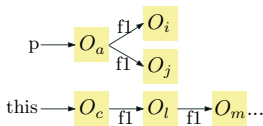
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- The points-to graph reachable only from p.f1 is *relevant* for bar.

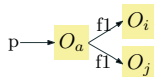
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Line 5:



Value-context



Relevant value-context

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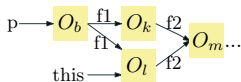
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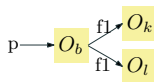
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Line 6:



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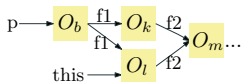
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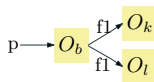
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- **Proposal:**  
Identify and use **relevant value-contexts**.

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**Result:**

Graphs to be stored/compared significantly smaller.



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- The lattice of points-to graphs is large.
- More contexts also imply comparison with more values at call-sites.

## Insight 2a: Level-summarization

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3.     void foo(){
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- For a given analysis, even if the relevant value-context changes, the analysis-result may not be affected.

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- For bar,  $O_9$  escapes only if the object(s) pointed-to by p or p.f1 escape.

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- For a given analysis, even if the relevant value-context changes, the analysis-result may not be affected.
- For bar,  $O_9$  escapes only if the object(s) pointed-to by p or p.f1 escape.
- **Proposal:** Compare only the level-summarized relevant value (LSRV-) contexts.

## Insight 2a: Example

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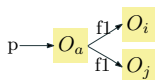
**Proposal:** Use LSRV-contexts.

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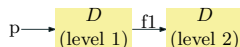
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**Proposal:** Use LSRV-contexts.

Line 5:



Relevant value-context



LSRV-context

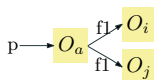


## Insight 2a: Example

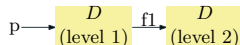
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Line 5:

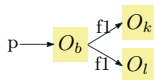


Relevant value-context

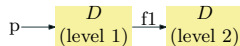


LSRV-context

Line 6:



Relevant value-context



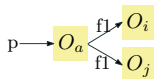
LSRV-context

## Insight 2a: Example

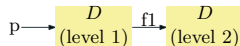
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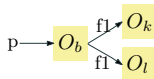


Relevant value-context

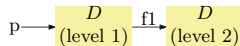


LSRV-context

Line 6:



Relevant value-context



LSRV-context

**Result:** bar analyzed only once!

## Insight 2b: Caller-ignorable

```
1. class A {
2.     A f1,f2;
3.     void foo(){
4.         ...
5.         c.bar(a);
6.         d.bar(b);
7.     }
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```

- Method fb is *caller-ignorable*.
  - Caller doesn't need fb's analysis.
  - fb can be analyzed separately.

## Insight 2b: Caller-ignorable

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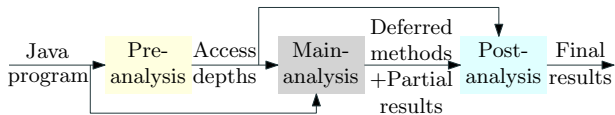
- Method fb is *caller-ignorable*.
  - Caller doesn't need fb's analysis.
  - fb can be analyzed separately.
- **Proposal:**  
Defer the analysis of caller-ignorable methods, and analyze them context-sensitively in a post-pass.

## Insight 2b: Caller-ignorable

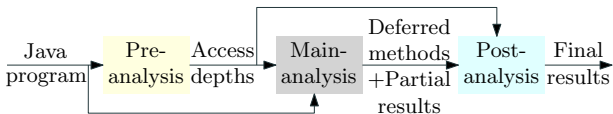
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15.        /*Doesn't access
16.        caller's heap*/
17.    }
18.}
```

- Method fb is *caller-ignorable*.
  - Caller doesn't need fb's analysis.
  - fb can be analyzed separately.
- **Proposal:**  
Defer the analysis of caller-ignorable methods, and analyze them context-sensitively in a post-pass.
- **Result:**  
Time and memory saved during the costly whole-program analysis.

# Proposed approach



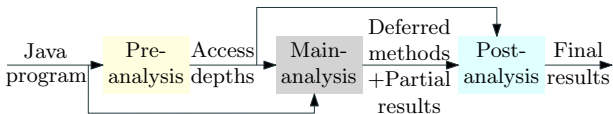
# Proposed approach



## 1. Pre-analysis

- Flow-insensitive, interprocedural – fast.
- For each method, compute the *access-depth* for each parameter.

# Proposed approach



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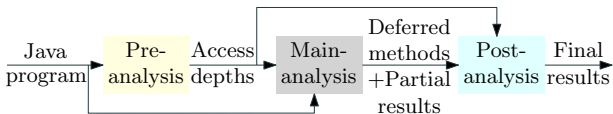
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## 2. Main-analysis

- Context- and flow-sensitive.
- Compare only LSRV-contexts and defer caller-ignorable methods.



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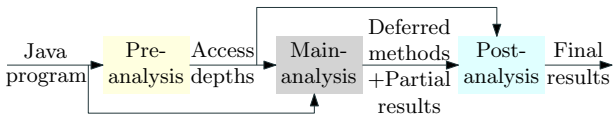
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- Context- and flow-sensitive.
- Compare only LSRV-contexts and defer caller-ignorable methods.

## 3. Post-analysis

- Analyze deferred methods context-sensitively.

*Detailed algorithms in the paper.*

## 1. Escape analysis

- Dataflow values:  $\{\text{DoesNotEscape } (D), \text{Escapes } (E)\}$ .
- Meet:  $D \sqcap D = D, D \sqcap E = E \sqcap D = E \sqcap D = E$ .

## 2. Control-flow analysis

- Find the types that can flow into each variable.
- Applications: call-graph construction, typecast checks, etc.
- Dataflow values: Set of all classes in the program.
- Meet: Union.

# Evaluation

- Implementation: Soot optimization framework
- Runtime: OpenJDK HotSpot JVM v8
- System: 2.3 GHz AMD with 64 cores and 512 GB RAM
- Benchmarks: DaCapo 9.12 and JGF

- B: Base
  - Escape analysis<sup>2</sup>
  - Control-flow analysis<sup>3</sup>

---

<sup>2</sup>(Value-contexts implementation of) John Whaley and Martin Rinard.  
Compositional Pointer and Escape Analysis for Java Programs. *OOPSLA 1999*.

<sup>3</sup>Rohan Padhye and Uday P. Khedker. Interprocedural Data Flow Analysis in Soot Using Value Contexts. *SOAP 2013*.

# Versions compared

- B: Base
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- OM: Only Main (i.e., no trimming of value-contexts)

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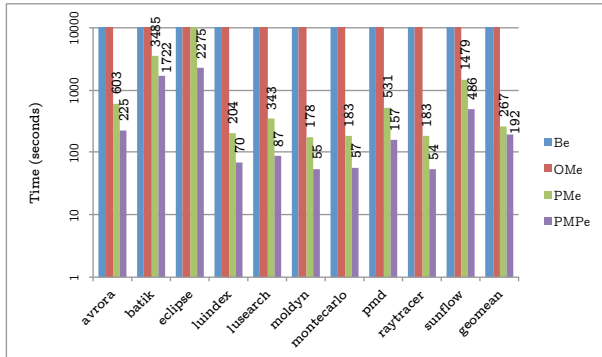
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- PM: Pre and Main (i.e., no deferring of methods)
- PMP: Pre, Main and Post (i.e., the full proposed version)

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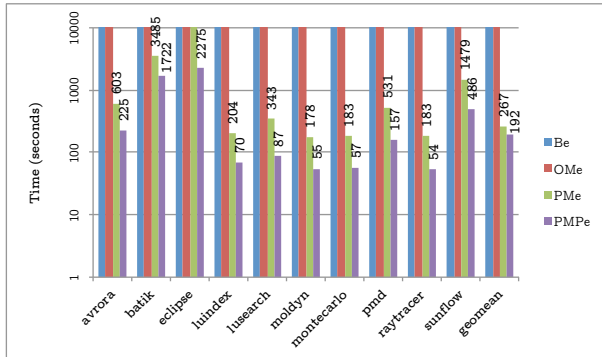
# Analysis time: Escape analysis



- B<sub>e</sub>: Base
- OM<sub>e</sub>: Only Main
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- PMP<sub>e</sub>: Pre, Main and Post

- B<sub>e</sub> and OM<sub>e</sub> do not terminate for any benchmark.

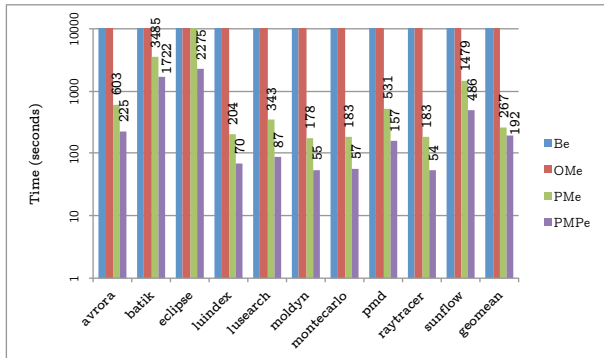
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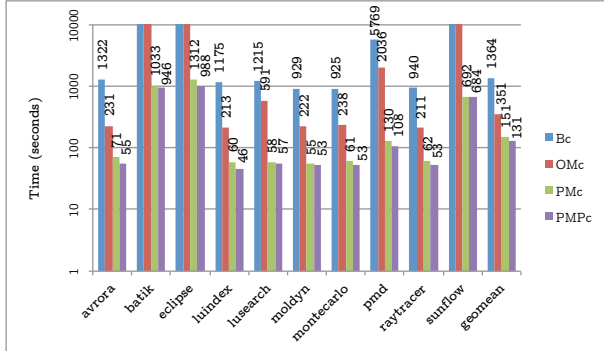
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- $PM_e$  scales better, but still does not terminate for eclipse.
- With just  $\sim 2$  seconds for the pre and post analyses,  $PMP_e$  scales for all benchmarks (average  $\sim 28\%$  over  $PM_e$ ).

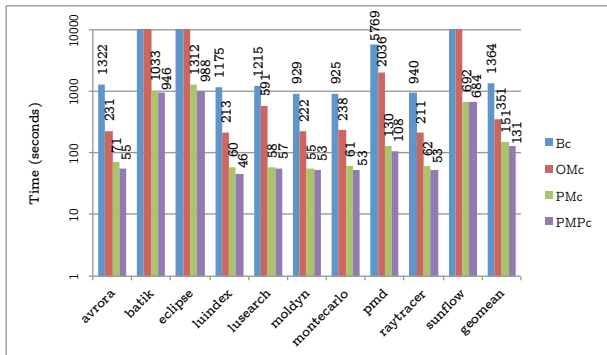
# Analysis time: Control-flow analysis



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- B<sub>c</sub> and OM<sub>c</sub> do not terminate for three large benchmarks.

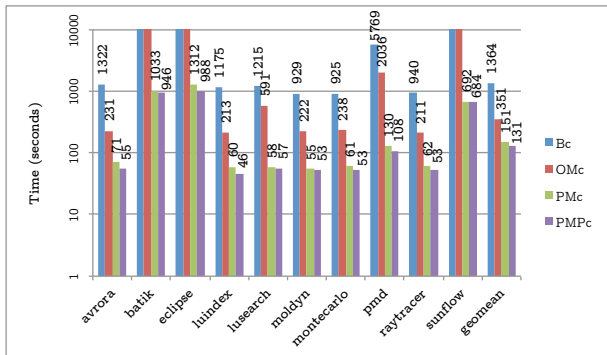
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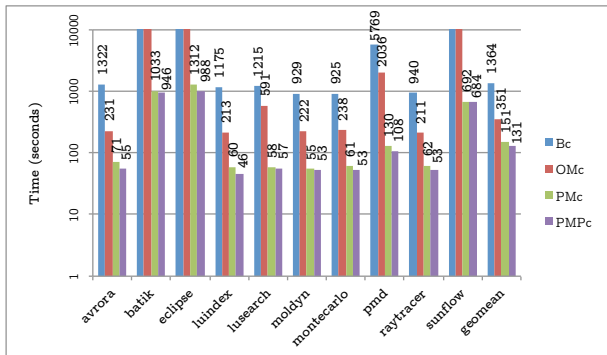
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Otherwise unanalyzable benchmarks in less than 40 minutes.



# Peak memory consumption

Bench- mark	Memory (GB)			
	$B_e$	$PMP_e$	$B_c$	$PMP_c$
avrrora	-	21	54	11
batik	-	45	-	64
eclipse	-	57	-	49
luindex	-	6	58	11
lusearch	-	10	54	11
pmd	-	11	127	13
sunflow	-	21	-	53
moldyn	-	6	29	11
montecarlo	-	6	29	9
raytracer	-	6	29	10
geomean	-	13	47	18

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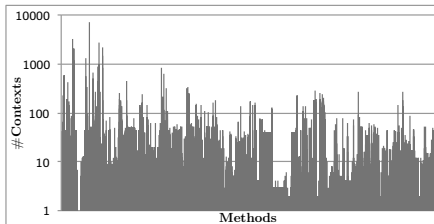
- Earlier, systems with very large memories ( $\sim 512\text{GB}$ ) were not enough.
- Now, a 32-64 GB machine should be sufficient.

## Number of contexts

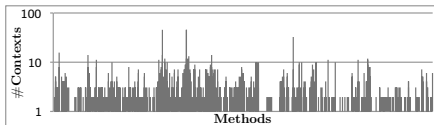
Bench- mark	Average #contexts			
	$B_e$	$PMP_e$	$B_c$	$PMP_c$
avrora	-	1.4	9.5	1.2
batik	-	1.4	-	1.3
eclipse	-	1.9	-	1.4
luindex	-	1.3	10.6	1.2
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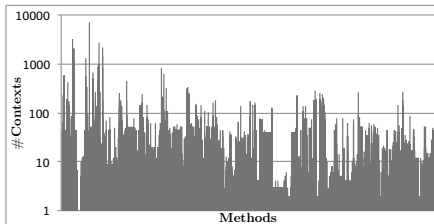
pmd- $B_c$



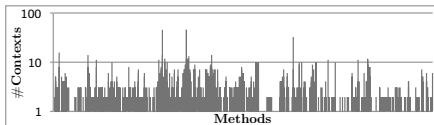
pmd- $PMP_c$

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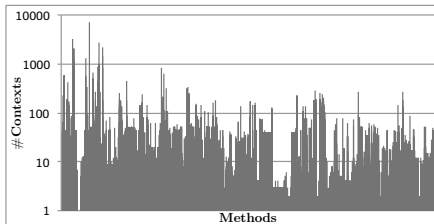


pmd- $PMP_c$

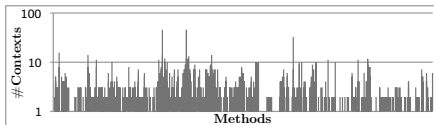
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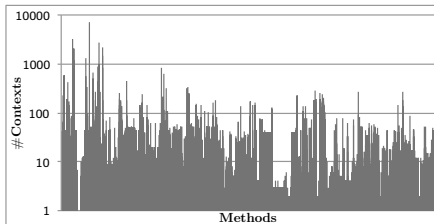


pmd- $PMP_c$

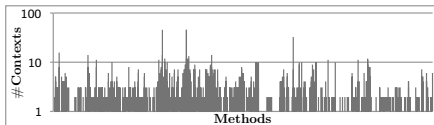
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pmd- $B_c$



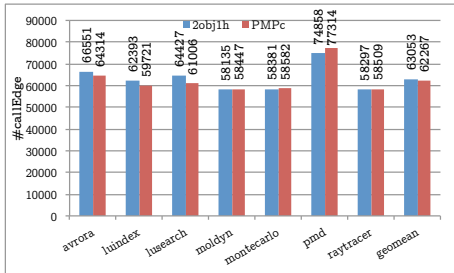
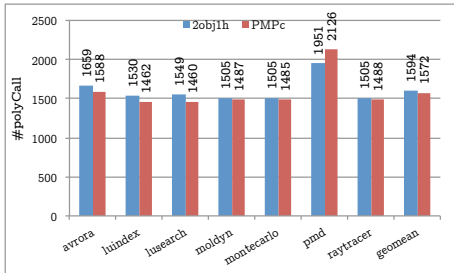
pmd- $PMP_c$

Significant reduction in #contexts  $\Rightarrow$  Significant reduction in resources spent  $\Rightarrow$  **Scalability.**



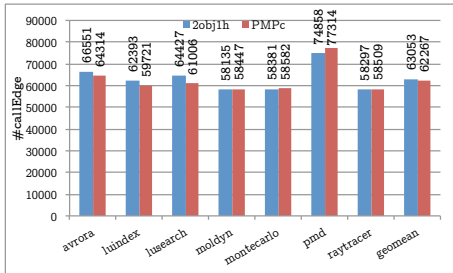
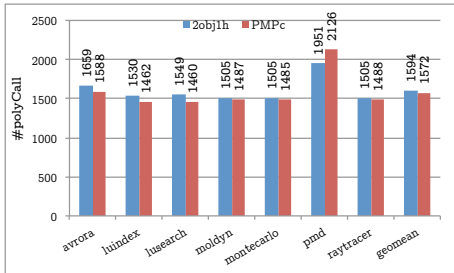


# Comparison with 2obj1h (lower the better)



- Precision: comparable.

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- Precision: comparable.
- Scalability:
  - 2obj1h did not terminate for batik, eclipse and sunflow.
  - For the rest: LSRV-contexts (PMP<sub>c</sub>) took **89.2%** lesser time and **59.4%** lesser memory.

# Conclusion and Future work

## Conclusion:

- LSRV-contexts **scale** whole-program context-sensitive analyses **without losing precision**.
- Identifying **relevance** of value-contexts is a novel and effective idea.
- Evaluation on two non-trivial analyses demonstrates the **generality**.

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**Thank you.**

## Example: Access-depths

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1. class A {
2.   A f1,f2;
3.   void foo(){
4.     ...
5.     c.bar(a);
6.     d.bar(b);
7.   }
8.   void bar(A p){
9.     A x = new A();
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11.    p.fb();
12.    p.fb();
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- For fb:  $\{\langle \text{this}, 0 \rangle\}$   
 $\Rightarrow$  fb is caller-ignorable
- Detailed algorithms for pre, main, and post analyses in the paper.

## Static characteristics of benchmarks

Bench- mark	Application		#Referred JDK classes
	#classes	size (MB)	
avrora	527	2.7	1588
batik	1038	6.0	3700
eclipse	1608	14.0	2589
luindex	199	1.3	1485
lusearch	198	1.3	1481
pmd	697	4.1	1607
sunflow	225	1.7	3509
moldyn	13	0.15	1555
montecarlo	19	0.67	1555
raytracer	19	0.21	1555

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Sizes range from 150 KB (small programs) to 14 MB (large applications).

## Analysis time: Pre and Post

Bench- mark	Analysis time (seconds)		
	Pre	Post <sub>e</sub>	Post <sub>c</sub>
avroa	1.0	0.4	0.5
batik	2.2	1.8	2.4
eclipse	2.7	6.0	6.1
luindex	1.1	0.4	0.7
lusearch	1.0	0.5	0.9
pmd	1.3	0.4	0.7
sunflow	2.1	1.6	2.2
modyn	0.9	0.4	0.6
montecarlo	0.9	0.4	0.3
raytracer	0.9	0.4	0.3
geomean	1.3	0.7	0.9

- Pre-analysis common for both the instantiations.

## Analysis time: Pre and Post

Bench- mark	Analysis time (seconds)		
	Pre	Post <sub>e</sub>	Post <sub>c</sub>
avro	1.0	0.4	0.5
batik	2.2	1.8	2.4
eclipse	2.7	6.0	6.1
luindex	1.1	0.4	0.7
lusearch	1.0	0.5	0.9
pmd	1.3	0.4	0.7
sunflow	2.1	1.6	2.2
moldyn	0.9	0.4	0.6
montecarlo	0.9	0.4	0.3
raytracer	0.9	0.4	0.3
geomean	1.3	0.7	0.9

- Pre-analysis common for both the instantiations.
- The time required for both the pre and the post analyses is negligible ( $\sim 2$  seconds).