

Dynamic Metrics for Java

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Outline

- Introduction and motivation
- Desirable qualities for dynamic metrics
- Kinds of dynamic metrics
- Examples of dynamic metrics
- Using dynamic metrics for optimization
- *J Framework
- Related work
- Future work & Conclusion

Motivation

- Compiler techniques are aimed at programs which are
 - numeric
 - memory-intensive
 - concurrent
 - pointer-intensive
 - ...
- Necessary to assess the *relevance* of optimizations

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- Compiler techniques are aimed at programs which are
 - numeric
 - memory-intensive
 - concurrent
 - pointer-intensive
 - ...
- Necessary to assess the *relevance* of optimizations
- **Problem:** How to determine which programs fit into these categories?

Motivation (2)

- **Answer #1:** Use a programmer's intuition

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- **Answer #2:** Measure characteristics of the software

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 - No well-established way of performing categorization based on measures
 - Measurements are often performed *statically*
- **Answer #3:** Quantify *dynamic* behaviour of the software (dynamic metrics)

Goals

- Measure relevant runtime properties of programs
- Provide a methodology to compute dynamic metrics
- Provide a *concise* and *informative* set of metrics
- Provide a database of dynamic metrics

Desired Qualities for Dynamic Metrics

- Dynamic
- Unambiguous
- Robust
- Discriminating
- Machine-independent

} Not necessarily
achieved

Desirable Qualities – Dynamic

“Dynamic metrics should measure an aspect of a program that can only be obtained by running it.”

- Dynamic metrics should not be affected by dead code

Desirable Qualities – Unambiguous

“Ambiguous metric definitions lead to unusable metrics.”

- e.g. Lines of Code (LOC) as a (static) measure of program size
 - comments?
 - blank lines?
 - programming style?

Desirable Qualities – Robust

“A small *relevant* change in behaviour should cause a correspondingly small change in the resulting metric.”

- Example: # of *different* executed bytecode instructions instead of # of executed bytecode instructions
 - Example: Bubble Sort
 - Double input, quadruple # of executed bytecode instructions

Desirable Qualities – Discriminating

“A large *relevant* change in behaviour should cause a correspondingly large change in the resulting metric.”

- Dual to robustness
 - Constant value metric is robust, but useless
- Example: # of loaded classes (typically 270-290)
 - **not** discriminating

Desirable Qualities – Platform-Independent

“Metric values should be the same if measured on different platforms.”

- Very difficult to achieve
- Dictates some choices:
 - Time measurements in executed bytecode instructions instead of seconds
- Relevance depends on the characteristic to be quantified

Kinds of Dynamic Metrics

- Usual metrics belong to three categories:
 - Value
 - Percentile
 - Bin

Value metrics

- One value answers
- Typical examples
 - maximum
 - average
- Most suitable for:
 - observing differences before and after optimizations

Percentile metrics

- Pair consisting of percentage and threshold
- Typical example:
 - 15% of the allocation sites are responsible for 90% of the total allocated bytes
- Most suitable for:
 - determining how evenly distributed contributions are for a program characteristic

Bin metrics

- One value per subdivision of sample space
- Typical example:
 - Polymorphism (# of receivers/targets)

Bin #	# of receivers	% of call sites
1	1	73%
2	2	11%
3	≥ 3	14%

- Most suitable for:
 - providing measurements in accordance with specific optimization cases

Naming scheme

`category.name.kind`

- **Category:** logical group of the metric
- **Name:** name of the metric. Prefix `app` denotes the application-only version (i.e. excluding libraries)
- **kind:** either `value`, `percentile` or `bin`

Benchmark Programs

- **EMPTY**: Empty program
- **COEFF**: Computes polynomial approximation of order 0 to n for a set of points
- **COMP**: SPECjvm98 compress, performs Lempel-Ziv compression
- **JAVAC**: SPECjvm98 javac, a java compiler

Program Size and Structure

- **size.[app]run.value:**

touched bytecode insts

Metric	EMPTY	COEFF	COMP	JAVAC
size.run.value (increase)	7343	12880 175%	14514 113%	37830 261%
size.appRun.value (increase)	0	975 n/a	5084 521%	26267 517%

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Data Structures

■ data.[app]arrayDensity.value:

$$\frac{\# \text{ array bytecode insts}}{\# \text{ executed bytecode instructions}} \times 1000$$

Metric	EMPTY	COEFF	COMP	JAVAC
data.arrayDensity.value	73	151	52	38
data.appArrayDensity.value	n/a	160	52	15

■ pointer.[app]refFieldAccessDensity.value:

$$\frac{\# \text{ reference field accesses}}{\# \text{ executed bytecode instructions}} \times 1000$$

Metric	EMPTY	COEFF	COMP	JAVAC
data.refFieldAccessDensity.value	6	31	44	50
data.appRefFieldAccessDensity.value	n/a	33	44	76

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Polymorphism

- **polymorphism.[app]invokeDensity.value:**

$$\frac{\# \text{ executed invokevirtual or invokeinterface instructions}}{\# \text{ executed bytecode instructions}} \times 1000$$

Metric	EMPTY	COEFF	COMP	JAVAC
polymorphism.invokeDensity.value	15	61	17	39
polymorphism.appInvokeDensity.value	n/a	66	17	72

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Polymorphism (2)

- **polymorphism.[app]targetArity.bin:** measures the percentage of all *call sites* which have 1,2 or ≥ 3 different target methods:

Metric	EMPTY	COEFF	COMP	JAVAC
polymorphism.targetArity.bin(1)	98.4%	98.8%	98.3%	91.2%
polymorphism.targetarity.bin(2)	1.4%	1.0%	1.5%	3.4%
polymorphism.targetarity.bin(3+)	0.2%	0.1%	0.2%	5.4%
polymorphism.apptargetarity.bin(1)	n/a	100.0%	98.1%	89.7%
polymorphism.apptargetarity.bin(2)	n/a	0.0%	1.9%	3.8%
polymorphism.apptargetarity.bin(3+)	n/a	0.0%	0.0%	6.5%

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polymorphism.apptargetarity.bin(1)	n/a	100.0%	98.1%	89.7%
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Memory Use

- **memory.byteAllocationDensity.value:**

$$\frac{\# \text{ allocated bytes}}{\# \text{ executed bytecode instructions}} \times 1000$$

Metric	EMPTY	COEFF	COMP	JAVAC
memory.byteAllocationDensity.value	1750	109	11	132

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Concurrency and Synchronization

■ concurrency.lock.percentile:

$$\frac{\# \text{ locks responsible for 90\% of locking ops}}{\# \text{ touchedlocks}} \times 100$$

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concurrency.lock.percentile	66.7%	10.3%	56.7%	6.2%

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Using Metrics for Optimization

■ Benchmark: JOlden Voronoi

Metric	Orig	Inline	PT+CSE
base.executedInstructions.value	445.13 M	287.86 M	282.08 M
size.appRun.value	1008	1449	1425
poly.appInvokeDensity.value	116.17	10.84	11.06
poly.appTargetArity.bin(1)	1	1	1
pointer.appFieldAccessDensity.value	126.7	196.1	177.8

Executing VM	Orig	Inline	PT+CSE
Interpreter (sec)	51.40	33.38	32.17
JIT-noinlining (sec)	11.06	8.61	8.64
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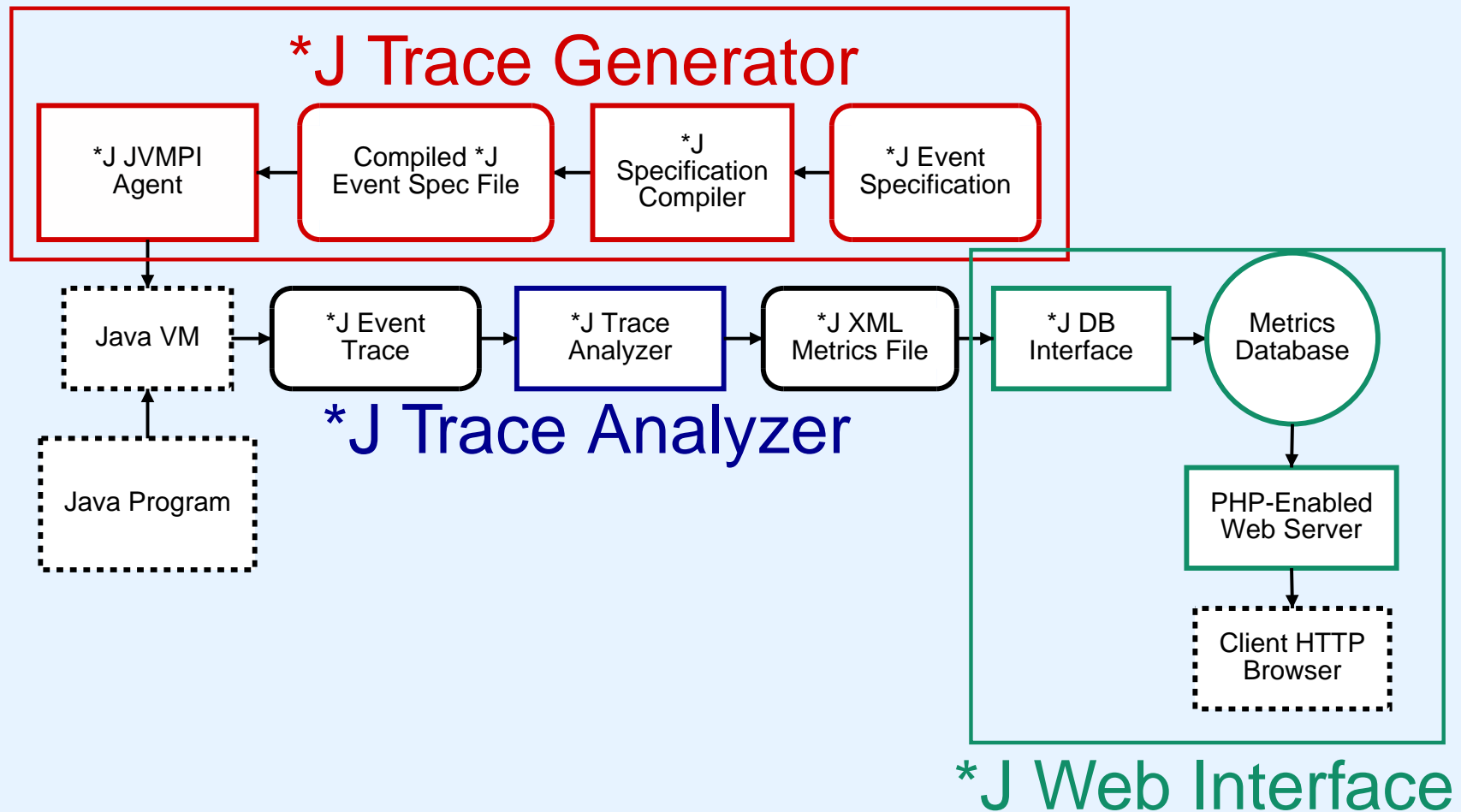
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*J Framework at a glance



(Poster on display)

<http://www.sable.mcgill.ca/~bdufou1/starj/>

Website Usage

Dynamic Metrics - Konqueror

Dynamic Metrics Home

News

Documentation

- Publications

Metrics

- Program size and structure
- Measurements of data structures
- Polymorphism
- Dynamic memory use
- Concurrency



Benchmarks

- Search
- Compare
- Download
- All results

Related Projects

- Evolve
- STEP

Sable Home

 **Benchmark Comparison Page** 

Last updated: April 24, 2003

Home

Edit Selection | New Comparison

Metrics	JOlden-Voronoi (Sootified)	JOlden-Voronoi (Inlined VTA)	JOlden-Voronoi (Inlined VTA CSE PT)																																																												
base.allocatedBytes.value	48 281 416	48 272 952	48 284 488																																																												
base.allocations.value	1 441 815	1 441 842	1 441 819																																																												
base.executedInstructions.value	445 148 336	287 859 689	282 075 076																																																												
base.loadedClasses.value	281	281	281																																																												
base.methods.value	54 588 642	5 889 740	5 889 827																																																												
concurrency.lock.percentile	(90%) 73.1%	(90%) 73.1%	(90%) 73.1%																																																												
concurrency.lock.Contended.percentile	N/A	N/A	N/A																																																												
concurrency.lock.ContendedDensity.value	0	0	0																																																												
concurrency.lock.Density.value	0.001	0.001	0.001																																																												
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data.floatDensity.value	216.477	246.752	251.928																																																												
data.numArrayDensity.value	0.046	0.070	0.072																																																												
data.refArrayDensity.value	29.045	44.916	45.837																																																												
memory.averageAppObjectSize.value	25.600	25.600	25.600																																																												
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Related Work

- Static metrics & Measurement Theory
 - Fenton & Pfleeger
 - Chidamber & Kemerer
- Dynamic Program Analysis
 - Dieckmann & Hölzle
 - Shuf et al.
 - Daly et al.
- Dynamic metrics
 - Aggarwal
 - Mitchell & Power

Future Work

- Implement a general-purpose profiling framework in SableVM
 - Extend metric possibilities
 - Improve performance
- Extend the set of metrics
- Formalize the desirable qualities

Conclusions

- We have defined a concise set of metrics suitable for compiler optimizations
- We have shown the usefulness of those metrics
- We have built a framework that allows to measure most of the defined metrics

`http://www.sable.mcgill.ca/metrics/`