

# Efficient Trace Monitoring

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## Abstract

A wealth of recent research involves generating program monitors from declarative specifications. Doing this efficiently has proved challenging, and available implementations often produce infeasibly slow monitors. We demonstrate how to dramatically improve performance — typically reducing overheads to within an order of magnitude of the program’s normal runtime.

**Categories and Subject Descriptors** D.3.4 [Programming Languages]: Processors—Compilers

**General Terms** Experimentation, Languages, Performance

**Keywords** Program monitoring, runtime verification, program analysis, aspect-oriented programming

## 1. Introduction

Generating program monitors from declarative trace specifications is currently a very active research area (*e.g.* [3–5]). Proposals have been put forward by the runtime verification and aspect-oriented programming communities. Both have discovered the difficulty of making trace monitoring feasible — clearly any naive implementation of an entity that observes the entire trace of program execution is bound to be prohibitively expensive. The fact that many proposals remain at the stage of research prototypes and that there are few “real” implementations is a clear indication of the inherent difficulties. In this work we provide efficient and feasible implementation strategies for declarative trace monitoring based on tracematches [1]. Our techniques do *not* require a whole-program analysis of the base program that is being monitored.

## 2. Tracematches

Figure 1 introduces our example and illustrates the syntax of a tracematch. It shows a program monitor that checks the following *safe enumeration* property:

After an enumeration is created, the data-source upon which it is based may not be modified while the enumeration is in use — that is, until the last call to its `nextElement()` method.

The regular expression (line 15) picks out violations of this property. It matches the *filtered* execution history of a program at

```
1 pointcut vector_update () :  
2   call (* Vector.add *(..)) || call (* Vector.clear ()) ||  
3   call (* Vector.insertElementAt (..)) ||  
4   call (* Vector.remove *(..)) ||  
5   call (* Vector.retainAll (..)) || call (* Vector.set *(..);  
6  
7 tracematch(Vector ds, Enumeration e) {  
8   sym create after returning(e) :  
9     call (Enumeration+.new (..)) && args(ds);  
10  sym next before :  
11    call (Object Enumeration.nextElement ()) && target(e);  
12  sym update after :  
13    vector_update () && target(ds);  
14  
15  create next* update+ next  
16  {  
17    throw new ConcurrentModificationException ();  
18  }  
19 }
```

**Figure 1.** Tracematch for unsafe enumerators.

the point a violation occurs. This filtering removes all events which don’t correspond to the alphabet of the regular expression (defined in lines 8–13).

A complete semantics of tracematch matching is beyond the scope of this document, full details can be found in [1].

Our design differs from existing approaches in that tracematches allow free variables in symbols — the stipulation is that there must be a consistent binding of the free variables to program values to trigger a match; filtering, thus, becomes specific to possible values of the variables. For example, after filtering, the trace `create (ds1,e1), create (ds2,e2), update (ds1), next (e2), next (e1)`

will match once with variable bindings `(ds1,e1)` — these can be accessed in the body. Using free variables, it is possible to query the history of specific object instances.

## 3. Challenges

Efficiently implementing *any* trace monitoring feature is certainly no easy undertaking. We have identified a series of challenges that implementors must address, and propose solutions to them that have been proved to work in the case of tracematches.

The overall design of a trace monitor is similar to a parsing concern — we would like to recognise the interesting traces of the program, observing one event at a time. However, the usual textbook techniques for parser generation and optimisation apply only in a limited form, due to the presence of filtering and free variables.

We choose to view the task of picking out relevant traces as a finite-state automaton recognising some language. This is a rather pervasive idea in the field, and much of the related work shares it.

CHALLENGE 1 (Automaton Construction). *Using automata to implement trace monitors is a natural idea, but some care must be taken.*

Both performance and correctness can suffer if this is approached naively. We identify the requirements and develop an algorithm for constructing a matching automaton from a trace-match.

CHALLENGE 2 (Partial Matches). *During program execution, we must keep some record of partially completed matches, since matching happens in an incremental fashion — the trace is observed one event at a time. Comparison to related work has shown that doing this naively by using some generic data structure incurs unnecessary overheads.*

Our solution is to generate partial match classes that are specialised to the particular tracematch. We represent the matching state in disjunctive normal form — each disjunct corresponds to a filtered trace that might lead to a complete match. By customising the representations of these disjuncts, we are able to reduce memory usage and ensure access time to bound variables is a simple field access. Also, a lot of the conditional logic required in the updates that happen when a new event is observed can be unrolled into the specialised methods, resulting in faster execution.

CHALLENGE 3 (Partial Match Representation). *A common problem is that even though a large number of partial matches can be accumulated during the execution of the program, each event only requires the update of a small subset of these.*

We exhibit an algorithm and data structure (*indexing*) which significantly alleviate this problem — whenever possible, only the relevant partial matches are traversed during an update.

CHALLENGE 4 (Space Leaks). *Since tracematches allow the capture of program values, it is natural to be concerned about possible space leaks — if some object is captured by a TM variable, it might not be reclaimed by the garbage collector as it normally would have been, and over the course of a program execution memory will be wasted.*

We propose a comprehensive set of analyses to address this problem, categorising the free variables a tracematch defines into groups according to their memory behaviour, and eliminating space leaks whenever possible (while giving a compile-time warning when it isn't). A full evaluation of those challenges and more comprehensive benchmark results can be found in [2].

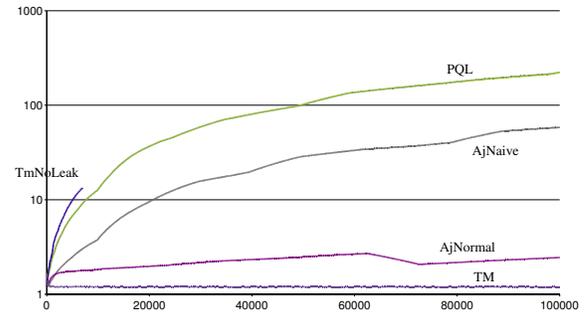
## 4. Performance and Future Work

Table 1 shows the performance differences that the optimisations make when applying the safe enumeration tracematch to a loop performing 100,000 animation steps in JHOTDRAW, a figure drawing package. The entries in this table give the running times for: (1) the uninstrumented program, (2) three increasingly sophisticated pure AspectJ implementations of the SAFEENUM checker, (3) three variations of the tracematch (TM) implementation, (4) a hand-coded alternative implementation using intertype-declarations and (5) the performance of PQL [4] implementing the same checker.

As we can see, out of the handcrafted AspectJ versions only the one which was specifically fine-tuned for this checker and program reaches a runtime performance close to that of the uninstrumented program. For tracematches, leak detection proves crucial — after 10 hours we aborted the run where it was disabled. Indexing however also proves to give strong optimization results and finally brings us into the same order of magnitude as an average hand-coded AspectJ implementation.

Setup	Runtime
Uninstrumented program	5.11s
Naive AspectJ implementation	21.11s
Average AspectJ implementation	20.77s
Fine-tuned AspectJ implementation	5.40s
TM without leak detection	> 10h
TM without indexing	130.7s
TM with all current optimizations	96.33s
AspectJ with Intertype-declarations	6.64s
PQL	444.9s

**Table 1.** Performance comparisons  
Memory usage every 100 steps [MB]



**Figure 2.** Memory usage for SAFEENUM on JHOTDRAW

It will remain very challenging to derive a general algorithm which reaches the same performance as the highly-tuned AspectJ version. However, for future work we are planning to implement an alternative code generation strategy based on inter-type declarations. We hand-coded an aspect that reflects how code generated in such a way would perform. As we can see, with 6.64s runtime we come very close to the feasible minimum. We believe there is also further scope to improve our indexing data structure and algorithm.

The comparison with PQL [4] gives an indication of the advantages of generating specialised code for representing automata and partial matches, because PQL is a similar trace monitoring system which does not perform those two optimisations.

With respect to memory, Figure 2 shows that the leak detection pays off. Tracematches show better memory behaviour than the average hand-coded AspectJ aspects and in contrast to PQL, show constant memory usage over time.

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