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# MARQ: Monitoring At Runtime with QEA

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in collaboration with

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at University of Manchester, UK

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Runtime Monitoring

Quantified Event Automata

Efficient monitoring

Using MARQ

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#### Runtime Monitoring

Quantified Event Automata

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## Motivation

- See lots of other talks for why we want formal guarantees about correctness of software systems
- Static verification has many successes but
  - It can have scalability issues
  - It often works with abstractions of the real system
  - It often needs to make assumptions about the environment and input data
- Runtime verification is a complementary technique that tackles these issues by 'verifying' a single run of the system
- Additionally, if performed at runtime it can be used to *stop* or *correct* bad behaviour

## Runtime Monitoring Problems

#### Runtime Monitoring

Checking whether an execution trace  $\tau$  produced at runtime satisfies a given a (typically temporal) specification  $\phi$ 

#### **Online Runtime Monitoring**

Performing runtime monitoring alongside the running system.

#### Offline Runtime Monitoring

Performing runtime monitoring on a log file after running the system.

#### Parametric Runtime Monitoring

Runtime monitoring with *first-order* specifications i.e. ones that deal with data-carrying events

Instrument the system to observe a trace of relevant events



The monitor uses the given property ....



... to process each event ... possibly providing feedback...



... and finally computing a verdict - did the system pass?



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## Online Runtime Monitoring in Practice

- Lots of pragmatic considerations
  - Instrumentation
  - Overhead
  - Interference
- Commonly shown to be useful for checking usage of libraries successful application to large open source projects
- Recent industrial successes in the banking industry for monitoring reliability and correctness
- Applicable to safety-critical systems i.e. aerospace, automotive, medical.

### Offline Runtime Monitoring in Practice

- Idea: record behaviour and check afterwards
  - Gives minimal/predictable overhead
  - Applies to more general domains/settings
  - Only get what is recorded
- Offline RV successes at NASA's JPL
  - Used on the LADEE mission to check command sequences sent to the spacecraft as part of a daily testing regime
  - Used daily on the MSL mission to check rules against Spacecraft telemetry logs sent from Curiosity

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## Parametric (or first-order) Properties

- Originally runtime verification considered properties over event names i.e. using propositional LTL or automata
- A parametric event consists of a name and a list of data values
- Examples:
  - An iterator *i* created from a collection *c* should not be used after *c* is updated
  - Every start(t) should have a corresponding stop(t)
  - If locks  $l_1$  and  $l_2$  are taken in one order by a thread t then later they should not be taken in the reverse order by any thread
- Introduces new challenges in terms of specification languages and monitoring algorithms

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## Contributions

- $\bullet~We$  introduce the  $\mathrm{Mar}\mathrm{Q}$  runtime monitoring tool
- $\bullet \ {\rm MarQ}$  stands for Monitoring at runtime with QEA
- Quantified Event Automata (QEA) is a previously introduced specification language for parametric specifications

MarQ

- Can be used offline and online
- Supports all features of the QEA language
- Is efficient
  - Won the Offline and Java tracks of the CRV14, the first international competition on runtime verification.
  - Incorporates novel indexing, redundancy elimination and structural specialisation techniques

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## The Slicing idea

- Based on the notion of parametric trace slicing
  - Turns a quantified problem into a set of unquantified problems
- The basic idea of QEA
  - 1. Use a list of *quantifications* to define *trace slices* relating to separate valuations of quantified variables
  - 2. Use an *extended finite state machine* to check properties over those slices
  - 3. The quantifications define which trace slices need to be accepted by the state machine

## Quantified Event Automata

### Definition (Event Automaton)

An Event Automaton  $\langle \mathcal{Q}, \mathcal{A}, \delta, q_0, \mathcal{F} \rangle$  is a tuple where

- Q is a set of states,
- $\mathcal{A} \subseteq SymbolicEvent$  is a alphabet of events,
- $\delta \subseteq (Q \times A \times Guard \times Assign \times Q)$  is a set of transitions,
- q<sub>0</sub> is an initial state, and
- $F \subseteq Q$  is a set of final states.

#### Definition (Quantified Event Automaton)

A QEA is a pair  $\langle \Lambda, E \rangle$  where

- $\Lambda \in (\{\forall, \exists\} \times \texttt{variables}(E) \times \texttt{Guard})^*$  is a list of quantified variables with guards, and
- E is an Event Automaton

### UnsafeMapIterator Example

#### Property : UnsafeMapIterator

An iterator created from a collection created from a map should not be used after the map is updated.



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### Demonstrating slicing

 $\texttt{create}(M, C1).\texttt{iterator}(C1, 1).\texttt{use}(1).\texttt{update}(M).\texttt{create}(M, C2).\\\texttt{iterator}(C2, 12).\texttt{iterator}(C2, 13).\texttt{use}(13).\texttt{update}(M).\texttt{use}(12)$ 

There are six possible bindings



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### Demonstrating slicing

 $\frac{\text{create}(M, C1).\text{iterator}(C1, 1).\text{use}(1).\text{update}(M).\text{create}(M, C2).}{\text{iterator}(C2, 12).\text{iterator}(C2, 13).\text{use}(13).\text{update}(M).\text{use}(12)}$ 

For m = M, c = C1, i = I1



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### Demonstrating slicing

 $\texttt{create}(M, C1).\texttt{iterator}(C1, /1).\texttt{use}(/1).\texttt{update}(M).\texttt{create}(M, C2).\\ \texttt{iterator}(C2, /2).\texttt{iterator}(C2, /3).\texttt{use}(/3).\texttt{update}(M).\texttt{use}(/2)$ 

For m = M, c = C2, i = I2



### Demonstrating slicing

create(M, C1).iterator(C1, 11).use(11).update(M).create(M, C2).iterator(C2, 12).iterator(C2, 13).use(13).update(M).use(12)

For m = M, c = C2, i = I3



### Demonstrating slicing

create(M, C1).iterator(C1, 1).use(1).update(M).create(M, C2).iterator(C2, 12).iterator(C2, 13).use(13).update(M).use(12)

There exists a slice that reaches a final state. The quantifications mean that the trace violates the property.



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### Free Variables

- Some variables in the Event Automaton may not be quantified
- These are called free variables
- Free variables are (re)bound as the trace is processed
- Allowing us to capture changing data values

## Auction Bidding Example

#### Property : Auction Bidding

Amounts bid for an item should be strictly increasing.



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### UnsafeMapIterator Example

#### Property : UnsafeMapIterator

An iterator created from a collection created from a map should not be used after the map is updated.



### Monitoring algorithm

- There is a map M from bindings (of quantified variables) to sets of configurations (reached by that slice)
- For each incoming event
  - Decides if new bindings need to be created, possibly extending existing bindings
  - Updates configurations related to existing relevant bindings
  - Produces a verdict based on the quantifications and M

bindings		configurations
m=M1,c=C1	$\longrightarrow$	{ 2 }
m=M1,c=C1,i=I1	$\longrightarrow$	{3}

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# Efficient monitoring with $\mathrm{M}\mathrm{A}\mathrm{R}\mathrm{Q}$

- Obviously for *online* monitoring *overhead* and *interference* are very important
- For *offline* monitoring we still need practically efficient trace processing
- $\mathrm{Mar}\mathrm{Q}$  achieves efficient monitoring in three ways
  - Indexing
  - Redundancy elimination
  - Structural specialisation
- We give a flavour of these techniques here

# Indexing

- The monitor needs to track the status of different valuations of quantified variables
- Given an event it needs to *quickly* find what needs to be updated. This is the indexing problem.
- MARQ uses symbol-based indexing



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# Indexing

#### • MARQ uses symbol-based indexing



# Indexing

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# Redundancy elimination



- Given this specification there are two observations
  - 1. A binding m=M,c=C does not need to be extended for use(I) as this does not tell us anything new
  - 2. If a monitored object is garbage collected it can no longer contribute to a failing trace slice
- Generalising these gives us a theory of *redundancy elimination* that ignores or removes bindings of quantified variables

### Structural specialisation

- Not all features of the QEA specification language are needed for every specification i.e. non-determinism, free variables
- However supporting these features makes the monitoring algorithm more complex
- Structural specialisation produces a monitoring algorithm based on the structure of the specification using special data structures
- Motivation: monitoring is the frequent repetition of the same small bit of code

# Results of the 1st competition on Runtime Verification



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# Results of the 1st competition on Runtime Verification





# Writing specifications with efficiency in mind

- Efficiency of the monitoring algorithm depends on the *structure* of the specification
- Therefore the way the specification is written matters
- Can achieve an order of magnitude speedup by changing the way the property is expressed

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# Separating specification and usage



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# Writing QEA specifications in MARQ



- The QEA Builder uses an API to construct a  $\rm QEA$
- The MonitorFactory constructs a monitor from that specification

```
QEABuilder q = new QEABuilder("safeiter");
```

```
int ITERATOR = 1; int NEXT = 2;
final int i = -1; final int size = 1;
q.addQuantification(FORALL, i)
```

```
q.addFinalStates(1, 2); q.setSkipStates(1);
```

```
QEA qea = q.make();
```

```
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int ITERATOR = 1; int NEXT = 2;
final int i = -1; final int size = 1;
q.addQuantification(FORALL, i)
```

```
q.addTransition(1,ITERATOR, i, size, 2);
q.addTransition(2,NEXT, i,
    isGreaterThanConstant(size,0),
    decrement(size),
    2);
```

```
q.addFinalStates(1, 2); q.setSkipStates(1);
```

```
QEA qea = q.make();
```

```
QEABuilder q = new QEABuilder("safeiter");
```

```
int ITERATOR = 1; int NEXT = 2;
final int i = -1; final int size = 1;
q.addQuantification(FORALL, i)
```

```
q.addFinalStates(1, 2); q.setSkipStates(1);
```

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QEA qea = q.make();
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### The Monitor Factory

```
public interface Monitor{
    public Verdict step(int name, Object[] args);
}
```

```
Monitor monitor = MonitorFactory.create(
    qea,
    GarbageMode.LAZY, //Optional
    RestartMode.REMOVE); // Optional
```

- A monitor is an object accepting events and producing verdicts
- The factory will analyse the specification and produce the best monitor it can (i.e. using *structural specialisation*)
- Optional modes
  - Garbage: handling monitored objects that are garbage collected
  - Restart: what to do when a violation occurs
Using MARQ

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# Offline monitoring with $\mathrm{M}\mathrm{A}\mathrm{R}\mathrm{Q}$



- We first create a Translator object for the trace
- Then using a QEA object and trace string we create a monitor
- Finally we call monitor to get a result

```
OfflineTranslator translator =
    new DefaultTranslator('`a'', ``b'', ``c'');
String trace = ``trace_dir/trace.csv'';
QEA qea = builder.make();
CSVFileMonitor m =
    new CSVFileMonitor(trace_name, qea, translator);
Verdict v = m.monitor();
```

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# Trace formats

- We support three trace formats proposed by the RV competition
  - CSV
  - JSON
  - XML
- We also provide tools for translating between formats
- Parsing is surprisingly important.
  - $\mathrm{Mar}\mathrm{Q}$  has an optimised parser for the CSV format
  - Also aparallel option that separates trace processing and monitoring.
- Parsers produce abstract event objects handled by translators before being passed to the monitor

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# Translators

- Translators map abstract events to monitor step calls
- They tackle three pragmatic issues

- 1. Name mappings
  - Map between event names used in the trace and specification
  - May not be one-to-one
- 2. Reordering parameters
  - The events recorded in the trace may not have the same structure as in the specification
  - Parameters may be reordered or removed
- 3. Interpreting values
  - Data values in events may need to be treated semantically
  - i.e. parsing into integers
  - May need to ensure values are interned

# Online monitoring with $\operatorname{MarQ}$



- Currently MARQ supports monitoring Java programs via AspectJ
- Instrumentation should handle verdicts
- However, we do not yet automatically generate AspectJ
- This is work in process, along with targetting other languages

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```
public aspect SafeIterAspect {
```

```
private int ITERATOR = 1; private int NEXT = 2;
private Monitor monitor;
```

```
SafeIterAspect(){
    QEA qea = SafeIter.get();
    monitor = MonitorFactory.create(qea);
}
```

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private Monitor monitor;
```

```
SafeIterAspect(){
    QEA qea = SafeIter.get();
    monitor = MonitorFactory.create(qea);
}
```

```
pointcut iter(Collection c) :
  (call(Iterator Collection+.iterator()) && target(c));
pointcut next(Iterator i) :
  (call(* Iterator.next()) && target(i));
after (Collection c) returning (Iterator i) : iter(c) {
    synchronized(monitor){
      check(monitor.step(ITERATOR,i,c.size()));
    }
}
before(Iterator i) : next(i) {
    synchronized(monitor){
      check(monitor.step(NEXT,i));
    }
}
```

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      check(monitor.step(NEXT,i));
    }
}
```

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```
private void check(Verdict verdict){
    if(verdict==Verdict.FAILURE){ <report error here> }
}
```

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## Future work

- External specification language
- Automated generation of instrumentation code
- Transformations from other Runtime Monitoring specification languages into QEA i.e. temporal logics, rule-based systems
- Automated transformations into syntactic classes with better efficiency guarantees
- Violation explanation

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#### And finally...

• The tool is available online

https://github.com/selig/qea

• Thanks for listening

## Non-determinism

$$\underbrace{\begin{array}{c} \forall u \forall t \\ \forall u \forall t \\ \end{pmatrix}}_{\text{withdraw}(u, a, t_2) \xrightarrow{s+a \leq 10k} \\ \text{withdraw}(u, a, t) \xrightarrow{a \leq 10k} \\ \hline 1 \\ \hline 1 \\ \hline 1 \\ \hline 2 \\ \hline 2 \\ \hline 3 \\ \hline 3$$

- By introducing non-determinism we can remove a quantifier
- The idea is to have a path through the automata for each t
- There is a trade-off between complexity in quantification and non-determinism

# Counting

$$\rightarrow \underbrace{1}_{\text{remove}(s, o) \xrightarrow{h=o.\text{hashCode}()}} 2 \xrightarrow{\text{observe}(s, o) \xrightarrow{h=o.\text{hashCode}()}} \text{add}(s, o) \xrightarrow{h=o.\text{hashCode}()},$$

$$\rightarrow \underbrace{1}_{\text{remove}(o)}^{\underline{h=o.\text{hashCode}();c:=1}} add(o) \xrightarrow{h=o.\text{hashCode}()} observe(o) \xrightarrow{h=o.\text{hashCode}()}, add(o) \xrightarrow{h=o.\text{hashCode}()} c:=c+1, c$$

- By making certain assumptions about how trace slices for a quantifier are related we can track instances with a counter
- Transformation needs more information than is in the specification

### Quantifier stripping



- Existential quantifiers on the right can be stripped
- This is a trivial case, more complex cases involve the introduction of guards and non-determinism



Property	Trace length	Runtime (milliseconds)		Speedup
		Original	Translated	
withdrawal	150k	3,050	2,106	1.44
persistenthash	4M	12,267	864	14.12
publishers	200k	355	37	9.59

- Can achieve an order of magnitude speedup
- A phenomenon not often talked about in RV papers
- Further work: automate these transformations