# Discrete-Event Simulation of Queueing Systems in Java: The jsimulation and jqueues Libraries

Guided Tour

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# **Preface**

This document describes the publicly available jsimulation and jqueues Java libraries for discrete-event simulation of queueing systems. Personally, I (merely) scratched the surface of queueing theory at Twente University back in the eighties, while working on my Master's Thesis on an operating system for transputers. Transputers are fast RISC processors with multiple on-chip communication links; back then, they were envisioned to become the building blocks of future massively parallel computer systems. Since our main applications of interest were in robotics, I attempted basic queueing theory in an attempt to find hard real-time response-time guarantees, in order to meet physical-world, mostly safety-related, deadlines.

During the largest part of the nineties, I worked on my PhD at Delft University of Technology. This time, I got to study queueing systems modeling distributed computing systems, which by then had overtaken parallel systems in terms of scientific interest. The main purpose of the research was to devise and analyze scheduling strategies for dividing in space and in time the computing resources of a (closed) distributed system among groups of users, according to predefined policies (named share scheduling at that time). In order to gain quantitative insight, I used the classic DEMOS (Discrete Event Modeling On Simula) software running on the SIMULA programming language. I made several modifications and extensions to the software, in order for it to suit my needs. For instance, it lacked support for so-called processor-sharing queueing disciplines in which a server ("processor") distributes at any time its service capacity among (a subset of) jobs present. In addition, I needed a non-standard set of statistics gathered from the simulation runs. In the end, both DEMOS and SIMULA itself proved flexible enough to study the research questions.

Like DEMOS, the jsimulation and jqueues Java software packages described in this book feature discrete-event simulation of queueing systems. The libraries are, as a combo, somewhat comparable to the DEMOS, yet there are important differences nonetheless. For instance, the libraries focus exclusively at algorithmic modeling of queueing systems and job visits; they do not cover additionally required features like sophisticated random-number generation, probability distributions, gathering and analyzing statistics, and sophisticated reporting; features all integrated in DEMOS. In that sense, DEMOS is a more complete package. On the other hand, the packages feature a larger range of queueing-system types, and, for instance, a model for constructing new queueing systems through composition of other queues. In addition, much care has been put into the atomicity of certain events, which allows for a wider range of queue invariants supported. Despite these differences, DEMOS has been a major inspiration in the design and implementation of jsimulation and jqueues.

For my current employer, TNO, I have performed, over the past decade (or even decades?), many simulation studies in Java related to the vehicle-to-vehicle communications in (future) Intelligent Transportation Systems, studying, for instance, position dissemination over CS-MA/CA wireless networks for Cooperative Adaptive Cruise Control and Platooning. At some point, I realized that it would be feasible to extract some useful and stable Java libraries from my ever increasing software repositories, and release them into the public domain. So, in a way, the libraries can be considered "collateral damage" from a variety of projects.

# Introduction

Queueing systems deal with the general notion of waiting for (the completion of) "something". They are ubiquitously and often annoyingly present in our everyday lives. If there is anything we do most in life, it is probably waiting for something to happen (finally winning a non-trivial prize in the State Lottery after paying monthly tickets over the past thirty years), arrive (the breath-taking dress we ordered from that webshop against warnings in the seller's reputation blog), change (the reception of many severely bad hands in the poker game we just happened to ran into), stop (the constant flipping into red of traffic lights while we are just within breaking distance in our urban environment), or resume (the heater that regularly happens to have a mind of its own during winter months).

Queueing systems also appear in computer systems and networks, in which they schedule available shared resources like processors, memory, and network ports among clients like computing applications. Or in wireless communications, where so-called 'listen-before-talk' access protocols (CSMA/CA) as used in wireless Local Area Networks monitor the received power level at the input stage in order to assess whether the transmission medium is idle before attempting to transmit. Or in automated production lines, where a partial product is routed to visit several service stations in sequence, each of them performing a specific task to the product.

Perhaps surprisingly given their wide variety in terms of applications, queueing systems usually share a common concept: a set of objects we will call *jobs* has to visit a set of objects we will call *queues*, in order to get something done. Depending on the complexity of the task to be performed, on the service capacity of the queue, and on the available competition among jobs, such a visit may vary in length (i.e., in sojourn time). This perhaps explains the great interest from the mathematical community in *queueing theory*: One often needs only a handful of variables and assumptions in order to model a wide range of applications. In most cases, the effects of these assumptions are modeled with suitable stochastic processes.

Despite great results in deriving closed-form analytic expressions for many queueing models, many more others are mathematically intractable. In order to gain quantitative insight into these models, one often resorts or needs to resort to discrete-event simulation, appropriately modeling queue scheduling behavior, and subjecting it to a workload consisting of jobs with appropriate parameters as to the amount of work each job requires, and the time between consecutive job arrivals. Even though discrete-event simulation does not provide closed-form solutions, they are often very handy and capable of, for instance, quantitative comparisons between various scheduling strategies.

This document introduces <code>jsimulation</code> and <code>jqueues</code>, open-source <code>java</code> software libraries for discrete-event simulation of queueing systems. Its main purpose is to expose you to the most important concepts in the libraries, and to get you going with your simulation studies. By no means is this document complete in its description of <code>jsimulation</code> and <code>jqueues</code>, nor is it intended to be, and for more detailed information we refer the reader to the "JQueues"

Reference Manual"<sup>1</sup> if you need precise specification of the libraries, and to the "JQueues Developer Manual"<sup>2</sup> if you want or need to extend either library (e.g., to add your own queueing discipline).

In Section 2 of the present document we provide installation (and build) instructions, and in Section 3 we present our "Hello World" example. In subsequent sections, in rather random order, we provide additional details and examples on the use of both libraries; attempting to allow linear reading. However, this is a living document and sections are added on demand and when time permits.

Any feedback on the clarity and/or correctness of the text is highly appreciated. Please use the *Issues* section on github to that purpose<sup>3</sup>.

<sup>&</sup>lt;sup>1</sup>The JQueues Reference Manual is currently being written, and will be available as an e-Book.

<sup>&</sup>lt;sup>2</sup>The JQueues Developer Manual is currently being written, and will be available as an e-Book.

<sup>&</sup>lt;sup>3</sup>See https://github.com/jandejongh/jqueues-guided-tour.

# Installation

# 2.1 The jsimulation and jqueues Libraries

In order to use jsimulation and jqueues, you have to install them first, which requires an Internet connection. The first public releases of jqueues and jsimulation have version number 5.2.0; they have been released under the Apache v2.0 license. From that version number onward, both libraries are distributed as Maven projects available from github.com and the Maven Central Repository (whichever suits you).

Since both jsimulation and jqueues are libraries and hardly support stand-alone operation, we assume that you intend to install them both as dependencies to your own project. You have several options, but the two most obvious ones are:

- Install the libraries from github, open them as Maven *projects* in your IDE and add them as dependencies to your own project. If you use Maven yourself for the latter, you only have to add the dependency on jqueues in the pom.xml. (You do not have to add jsimulation because Maven does this automatically for you.)
- Create your own Maven project and add jqueues as a dependency, taken from the Maven Central Repository.

In both cases, you will need maven installed and properly configured on your system. It is also highly recommended to install maven support in your IDE, so that it can directly open maven projects.

In the first case, you need git as well, and you should clone both libraries from github as shown below:

- \$ git clone https://www.github.com/jandejongh/jsimulation
- \$ git clone https://www.github.com/jandejongh/jqueues

Note that jsimulation and jqueues can only be built against Java 1.8 and higher.

In the second case, add the XML fragment shown in Listing 2.1 to the dependencies section in your pom.xml. Please make sure that you double-check the version number in the XML file<sup>1</sup>. The second case is safer as it uses stable, frozen, versions of the libraries released to Maven Central. These releases are signed and cannot be changed without increasing the version number.

<sup>&</sup>lt;sup>1</sup>You may want to verify the latest stable release number from either github or Maven Central. This Guided Tour applies to release 5.2.0 and beyond.

Listing 2.1: The dependency section for jqueues in a pom.xml.

```
<dependency>
  <groupId>org.javades</groupId>
  <artifactId>jqueues</artifactId>
  <version>5.2.0</version>
  <scope>compile</scope>
  <type>jar</type>
</dependency>
```

# 2.2 Version Numbering

For both libraries, we use three-level version numbering:

- The third, lowest, level is reserved for bug fixes, javadoc improvements and code (layout) "beautifications".
- The second, middle, level is reserved for functional extensions that do not break existing code (with the same major version number). Think of adding another queue, job or listener type.
- The third, major, level is reserved for changes to the core interfaces and classes that are likely to break existing code.

This implies that you can (should be able to) always "upgrade" to a later version from Maven Central as long as the major number remains the same. Upgrading from github.com requires a bit of care, as the latest version may not be stable yet.

Despite the fact that we take utmost efforts to *not* break existing code with upgrades of middle and minor version numbers, we cannot always avoid this. For instance, we may realize that a method should be **final** or **private** and attempt to fix that in an apparent innocent update, but you may have overridden (or used) that particular method already in your code to suit your own purposes. Needless to say, we did not expect you to override (or just use) that particular method in your code, just as well as you did not expect that you were not supposed to do so. But in the end, your code may not be compile-able after the upgrade. In order to avoid this, we recommend that you

- Prefer interface methods rather than specific ones from classes, since the chance that we consider updates of the interface as being "minor" is virtually nil.
- Only override methods for which the javadoc explicitly states that they are intended to be overridden.

# 2.3 The jqueues-guided-tour Project

All example code shown in this document is available from the jqueues-guided-tour project on github. The code is organized as a Maven project. In addition to the example code, it also contains all the source files (LaTeX and other) to the present document. Bear in mind, though, that the documentation and example code in jqueues-guided-tour are both released under a more restrictive license than jsimulation and jqueues. In short, you are allowed to use the documentation and example code to whatever purpose. You may also redistribute both in unmodified form. However, redistributing modified versions of either or both of them requires the explicit permission from the legal copyright holder.

# Hello World: FCFS

In this section, we introduce our "Hello World" application for jqueues<sup>1</sup>, consisting of a FCFS queue subject to arrivals of jobs with varying required service times.

In order to perform a simulation study in jqueues, the following actions need to be taken:

- The creation of an event list;
- The construction of one or more queues attached to the event list;
- The selection of the method for listening to the queue(s);
- The creation of a workload consisting of jobs and appropriately scheduling it onto the event list;
- The execution of the event list;
- The interpretation of the results, typically from the listener output.

Without much further ado, we show our "Hello World" example in Figure 3.1. We first create a single event list of type DefaultSimEventList and a FCFS queue attached to the event list (by virtue of the argument of FCFS's constructor). On the queue, we register a newly created StdOutSimEntityListener, issuing notifications to the standard output. Note that queues and jobs are so-called *entities*; these are the relevant objects with state subject to event invocation. Subsequently, we create ten jobs named "0", "1", "2", ..., scheduled for arrival at the queue at t = 0, t = 1, t = 2, ..., respectively, and set their respective service times. We then schedule each job arrival on the event list. Finally, we "run" the event list, i.e., let it process the arrivals.

Listing 3.1: A simple simulation with a single FCFS queue and ten jobs.

```
final SimEventList el = new DefaultSimEventList (0);
final SimQueue queue = new FCFS (el);
queue.registerSimEntityListener (new StdOutSimEntityListener ());
for (int j = 0; j < 10; j++)
{
    final double jobServiceTime = (double) 2.2 * j;
    final double jobArrivalTime = (double) j;
    final String jobName = Integer.toString (j);
    final SimJob job = new DefaultSimJob (null, jobName, jobServiceTime);
    SimJQEventScheduler.scheduleJobArrival (job, queue, jobArrivalTime);
}
el.run ();</pre>
```

The event list type DefaultSimEventList will suffice for almost all practical cases, but it is essential to note already that a *single* event-list instance is typically used throughout

<sup>&</sup>lt;sup>1</sup>In this Chapter, whenever we refer to jqueues, we silently assume that jsimulation is installed as well.

any simulation program. Its purpose of the event list is to hold scheduled events in non-decreasing order of schedule time, and, upon request (in this case through el.run), starts processing the scheduled events in sequence, invoking their associated actions. In this case, the use of events remains hidden, because jobs are scheduled through the use of utility method scheduleJobArrival. The zero argument to the constructor denotes the simulation start time. If you leave it out, the start time defaults to  $-\infty$ .

Our queue of choice is First-Come First-Served (FCFS). The constructor takes the event list el as argument. The queueing system consists of a queue with infinite places to hold jobs, and a single server that "serves" the jobs in the queue in order of their arrival. Once a queue has finished serving the (single) job, the job departs from the system.

So how long does it take to serve a job? Well, in jqueues, the default behavior is that a queue requests the job for its required service time. In the particular case of DefaultSimJob (there are many more job types), we provide a fixed service time (at any queue) upon creation through the third argument of the constructor.

The first argument of the DefaultSimJob is the event list to which it is to be attached. For jobs (well, at least the ones derived from DefaultSimJob), it is often safe to set this to null, although we could have equally well set it to el. However, queues must always be attached to the event list; a null value upon construction will throw an exception.

The (approximate) output of the code fragment of Listing 3.1 is shown in Listing 3.2 below. Remarkably, the listing only shows two types of notifications, viz., UPDATE and STATE\_CHANGED, the latter of which can hold multiple "sub"-notifications. Each notification outputs the name of the listener, the time on the event list, the queue (entity) that issues the notification, the notification's actual "major" type (UPDATE or STATE\_CHANGED) and, if present, the sub-notifications.

Apart from the STATE CHANGED, UPDATE and START\_ARMED lines in the output, the notifications pretty much speak for themselves. We even get notified when jobs start service (START). The START\_ARMED notifications refer to state changes in a special boolean attribute of a queue named its StartArmed property. Since you will hardly need it in practical applications, we will not delve into it, but it is crucial for the implementation of certain more complex (composite) queueing systems. Suffice it to say that the StartArmed property in this particular case signals whether the queue is idle.

The two top-level notification types, UPDATE and STATE CHANGED are essential. Upon every change to a queue's state, the queue is obliged to issue the fundamental STATE CHANGED notification, exposing the queue's new state (including its notion of time). The UPDATE notification has the same function, but it is fired *before* any changes have been applied, thus revealing the queue's *old* state, including the time at which the old state was obtained. Hence, every STATE CHANGED notification *must* be preceded with an UPDATE notification. The UPDATE notification is crucial for the implementation of statistics (among others).

The use of STATE\_CHANGED notifications may appear strange at first sight as many other implementations would report each of the sub-notifications individually. However, an important aspect of a queue's contract is that it must report state changes atomically in order to meet queue invariants. This means that listeners, when notified, will always see the queue in a consistent state, i.e., in a state that respects the invariant(s). This is one of the (we think) most distinguishing features of jqueues. Going back to our example: An important invariant of FCFS and many other queueing systems is that there cannot be jobs waiting in queue while the server is idle. It is easy to see that individual notifications for ARRIVAL and START would lead to violations of this invariant: Suppose that a job arrives at an idle FCFS queue. Using individual notifications, the queue has no other option than to issue a ARRIVAL notification immediately followed by a START. In between both, the queue would expose a state that is inconsistent with the invariant because the server is idle (the job has not started yet), while there is a job in its waiting queue. Note that another invariant of FCFS is that it cannot be

#### Listing 3.2: Example output of Listing 3.1.

```
StdOutSimEntityListener t=0.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [0]@FCFS]

> START [Start [0]@FCFS]

> DEPARTURE [Dep [0]@FCFS]

StdOutSimEntityListener t=1.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=1.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [1]@FCFS]

> START [Start [1]@FCFS]

> START [Start [1]@FCFS]

StdOutSimEntityListener t=2.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=2.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [2]@FCFS]

StdOutSimEntityListener t=3.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=3.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [3]@FCFS]

StdOutSimEntityListener t=3.2, entity=FCFS: UPDATE.

StdOutSimEntityListener t=3.2, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [1]@FCFS]

> START [Start [2]@FCFS]

StdOutSimEntityListener t=4.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=4.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [4]@FCFS]
              StdOutSimEntityListener t=0.0, entity=FCFS: STATE CHANGED:
  StdOutSimEntityListener t=4.0, entity=FCFS: UPDATE.

> ARRIVAL [Arr [4]@FCFS]
StdOutSimEntityListener t=5.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=5.0, entity=FCFS: UPDATE.

> ARRIVAL [Arr [5]@FCFS]
StdOutSimEntityListener t=6.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=6.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=6.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [6]@FCFS]
StdOutSimEntityListener t=7.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=7.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [7]@FCFS]
StdOutSimEntityListener t=7.600000000000005, entity=FCFS: UPDATE.

StdOutSimEntityListener t=7.60000000000005, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [2]@FCFS]

> START [Start [3]@FCFS]
StdOutSimEntityListener t=8.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=8.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [8]@FCFS]
StdOutSimEntityListener t=9.0, entity=FCFS: UPDATE.

StdOutSimEntityListener t=9.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [8]@FCFS]
StdOutSimEntityListener t=9.0, entity=FCFS: UPDATE.
StdOutSimEntityListener t=9.0, entity=FCFS: STATE CHANGED:

> ARRIVAL [Arr [9]@FCFS]
StdOutSimEntityListener t=14.200000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=14.200000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=14.200000000000001, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [3]@FCFS]
StdOutSimEntityListener t=23.0, entity=FCFS: UPDATE.
StdOutSimEntityListener t=23.0, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [4]@FCFS]
StdOutSimEntityListener t=34.0, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [4]@FCFS]
StdOutSimEntityListener t=34.0, entity=FCFS: UPDATE.
StdOutSimEntityListener t=34.0, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [5]@FCFS]
StdOutSimEntityListener t=47.2, entity=FCFS: UPDATE.
StdOutSimEntityListener t=47.2, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [6]@FCFS]
START [Start [7]@FCFS]
StdOutSimEntityListener t=62.60000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=62.60000000000001, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [7]@FCFS]
StdOutSimEntityListener t=80.20000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=80.200000000000002, entity=FCFS: UPDATE.
StdOutSimEntityListener t=80.200000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=80.200000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=80.200000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=100.0000000000001, entity=FCFS: UPDATE.
StdOutSimEntityListener t=100.0000000000001, entity=FCFS: STATE CHANGED:

> DEPARTURE [Dep [8]@FCFS]

> START [Start [9]@FCFS]

> START [Start [9]@FCFS]

> START [Start [9]@FCFS]

> START [Start [P]@FCFS]

> DEPARTURE [Dep [9]@FCFS]

> START [Start [P]@FCFS]

> START [Start [P]@FCFS]

> START [Start [P]@FCFS]

> START [Start [P]@FCFS]
```

serving jobs with zero required service time. This explains the arrival, start and departure sub-notifications for job 0 are all in a single atomic STATE\_CHANGED.

This concludes our "Hello World" example. There is obviously a lot more to tell, but the good news is that our example has already revealed the most important concepts of jqueues like the event list, events, entities, queues, jobs, listeners and notifications. The remaining complexity is in the richness and variation of these basic concepts.

# Events, Actions and the Event List

This chapter describes the event and event-list features that are available from the jsimulation package. Note that jsimulation is a dependency of jqueues. In most usage scenarios, there is no need to directly manipulate events or the event-list; the preferred method is to use *utility* methods for that. However, in order to describe in more detail the models of entities, jobs and queues, a basic understanding of what goes on under the hood of a DefaultSimEventList is very helpful.

# 4.1 Creating the Event List and Events

At the very heart of every simulation experiment in jqueues is the so-called event list. The event list obviously holds the events, keeps them ordered, and maintains a notion of "where we are" in a simulation run. Together, an event list and the events it contains define the precise sequence of actions taken in a simulation. The code snipplet in Listing 4.1 shows how to create an event list and schedule two (empty) events, one at  $t_1 = 5.0$  and one at  $t_2 = 10$ , and print the resulting event list on System.out. In jsimulation, the event list is of type SimEventList; events are of type SimEvent, respectively. Since both of them are Java interfaces, you need implementing classes to instantiate them: DefaultSimEventList for an event list; DefaulSimEvent for an event; typically you need a single event list and numerous events.

Listing 4.1: Creating the event list and populating it with events.

```
final SimEventList el = new DefaultSimEventList (-5);
final SimEvent el = new DefaultSimEvent (5.0);
final SimEvent e2 = new DefaultSimEvent (10.0);
el.add (e1);
el.add (e2);
el.print ();
el.run ();
System.out.println ("Finished!");
```

As explained in the previous chapter, the double argument in the DefaultSimEventList constructor is the initial time on the event list, its so-called default reset time. The double argument in the DefaultSimEvent constructor (of which there are several) is the schedule time of the event on the event list. Events, once created, are scheduled on the event list through the add method; the event list stores the events until use and maintains the proper order between them. The output of the code snipplet is shown in Listing 4.2<sup>1</sup>:

By virtue of the call to el.print, the output shows the name of the event list (as obtained from its toString method) and the current time (-5) in the first row, and then the events in

<sup>&</sup>lt;sup>1</sup>We may have improved the layout in the meantime.

Listing 4.2: Output of Listing 4.1.

the list in the proper order. Beware that the event-list is printed before the el.run statement; it would be empty afterwards.

Perhaps surprisingly, in <code>jsimulation</code>, the schedule time is actually held on the event, not on the event list. Also, a <code>SimEventList</code> is inheriting from <code>SortedSet</code> from the Java Collections Framework. These choices have the following consequences:

- Each SimEvent can be present at most once in a SimEventList. You cannot reuse a single event instance (like a job creation and arrival event) by scheduling it multiple times on the event list. Instead, you must either use separate event instances, or reschedule the event the moment it leaves the event list.
- You cannot (more precisely, *should not*) modify the time on the event while it is scheduled on an event list.
- You always have access to the (intended) schedule time of the event, without having to refer to an event list (if the event is scheduled at all) or use a separate variable to keep and maintain that time.
- The events must be equipped with a *total ordering* (imposed by SortedSet) and distinct events should not be equal (imposed by us). This means that for each pair of (distinct) events scheduled on a SimEventList, one of them is always strictly larger than the other (in the ordering, they cannot be "equal").
- If two or more events with identical schedule times are scheduled on a single event list, their relative order needs to be determined by other means than their schedule time. The DefaultSimEventList uses a random-number generator to break such ties. If, for some reason, you want to maintain *insertion order*, please have a look at DefaultSimEventList\_IOEL. Note that IOEL stands for Insertion Order Event List. But be warned: all (concrete) queue types in jqueues are specified against random ordering of simultaneous events.

Clearly, there is a lot more to say about simultaneous events, and about the reasons we chose for their random ordering while processing them, but we defer a detailed discussion for a later section. Nonetheless, it is important to realize that while an event say e1 is being processed at some time t, any other event say e2 scheduled at the same time on the event list is always processed after completion of e1. Even if e1 itself actually schedules e2. In other words, jsimulation does not support the concept of event preemption, and the action of an event (see below) is always processed atomically. This implies that it will not work to use the event list (1) to get something done "immediately after" the completion of an event, (2) to do something "when all other events at t" are done", and (3) to process an event e2 while processing an event e1 and then returning to the original event e1.

#### 4.2 Events

The output in Listing 4.2 shows four properties of a SimEvent:

• Time: The (intended) schedule time of the event (default  $-\infty$ ).

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• Name: The name of the event, which is only used for logging and output (default "No Name").

- Object: A general-purpose object available for storing information associated with the event (jsimulation nor jqueues uses this field; its default value is null).
- EventAction: The action to take, a SimEventAction (default null), described in the next section.

Each property has corresponding getter and setter methods on every SimEvent. In addition, DefaultSimEvent features multiple constructors that allow direct setting all or some of these properties upon construction.

#### 4.3 Actions

A SimEventAction defined what needs to be done by the time an event is *executed* or *processed*. In Java terms, a SimEventAction is an interface with a single abstract method which is invoked when the event is processed, in other words, it is a FunctionalInterface that can be used in lambda expressions. We show its declaration in Listing 4.3.

Listing 4.3: The SimEventAction interface.

```
@FunctionalInterface
public interface SimEventAction<T>
{
    /** Invokes the action for supplied {@link SimEvent}.
    *
    * @param event The event.
    *
    * @throws IllegalArgumentException If <code>event</code> is <code>null</code>.
    *
    */
    public void action (SimEvent<T> event);
}
```

There are several ways to create a SimEventAction but nowadays, by far the easiest is to use lambda expressions, as shown in Listing 4.4. Note that we are now using the full DefaultSimEvent constructor, passing a name, and supplying a SimEventAction through a lambda expression. The generated output is shown in Listing 4.5. Note that we replaced the package and class identification of the action with X for formatting purposes.

Listing 4.4: Creating and using SimEventActions.

## 4.4 Processing the Event List

Once the events of your liking are scheduled on the event list, you can start the simulation by *processing* or *running* the event lists. Processing the event list will cause the event list to equentially invoke the actions attached to the events in increasing-time order. There are several ways to process a SimEventList:

#### Listing 4.5: Example output of Listing 4.4.

- You can process the event list until it is empty with the run method.
- You can process the event list until some specified (simulation) time with the runUtil method.
- You can *single-step* through the event list with the runSingleStep method.

You can check whether an event list is being processed through its isRunning method.

While processing, the event list maintains a *clock* holding the (simulation) time of the current event. You can get the time from the event list through **getTime** nethod, although you can obtain it more easily from the event itself. You can insert new events while it is being processed, but these events must not be in the past. Once the event list detects insertion of events in the past, it will throw and exception.

Note that processing the event list is thread-safe in the sense that all methods involved need to obtain a *lock* before being able to process the list. Trying to process an event list that is already being processed from another thread, or from the thread that currently processes the list, will lead to an exception. Note that currently there is no safe, atomic, way to process an event list on the condition that is is not being processed already. Though you can check with <code>isRunning</code> whether the list is being processed or not, the answer from this method has zero validity lifetime.

## 4.5 Utility Methods for Scheduling Events

A SimEventList supports various methods for directly scheduling events and actions without the need to generate both the SimEvent and the SimEventAction. In most cases, the availability of one of the objects suffices. In Table 4.1 we show the most common utility methods for scheduling on a SimEventList. The use of these utility methods is highly preferred over direct manipulation of the underlying SortedSet interface, because we (may) intend to delete the SortedSet dependency in future releases altogether.

Note that E refers to the so-called *generic-type argument* of SimEventList. The prototype is SimEventList<E extends SimEvent>. The use of the generic type E allows you to restrict the use of a SimEventList to certain types of SimEvents, but for now E can be simply read as a SimEvent.

For any of the utilty methods that take a SimEventAction as argument, a new SimEvent is created on the fly, and returned from the method. Upon return from these methods, the newly created event has already been scheduled, and you *really* should not schedule it again.

So, how to *remove* events and actions from the event list? Well, since SimEventList implements the Set interface for SimEvent members, removing an event e from an event list el is as simple as el.remove (e). However, the preferred method is el.cancel (e).

## 4.6 Summary

The fundamental concepts in jsimulation are:

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Table 4.1: Utility methods for scheduling on a SimEventList.

#### Utility methods for scheduling on SimEventList

void schedule (E)

Schedules the event at its own time<sup>2</sup>.

boolean cancel (E)

Cancels (removes) a scheduled event, if present.

void schedule (double, E)

Schedules the event at given time.

reschedule (double, E)

Reschedules (if present, else schedules) the event at given new time.

E schedule (double, SimEventAction, String)

Schedules the action at given time with given event name.

void scheduleNow (E)

Schedules the event now.

E schedule (double, SimEventAction)

Schedules the action at given time with default event name.

E scheduleNow (SimEventAction, String)

Schedules the action now with given event name.

E scheduleNow (SimEventAction)

Schedules the action now with default event name.

- The Java package named jsimulation is a library for (single-threaded) discrete-event simulation.
- The Java package named jqueues is a library for (single-threaded) discrete-event simulation of queueing systems. The library depends on jsimulation.
- In order to perform discrete event simulations, an event list is needed, on which events can be scheduled. The event list maintains an ordering of the events it contains in non-decreasing simulation time. Typically, a single instance of an event list is used throughout the entire simulation study. The corresponding (abstract) types for event lists and events are defined in jsimulation, and named SimEventList and SimEvent, respectively. This package also provides a reasonable implementation for a SimEventList named DefaultSimEventList.
- On a SimEventList, all scheduled SimEvents are unique; you cannot schedule a SimEvent more than once on a single SimEventList. Typically, SimEvents are created and scheduled through various utility methods.
- The time at which a SimEvent is scheduled, is kept on the SimEvent itself, and available though the SimEvent.getTime method. Once scheduled, you cannot change the time of a SimEvent. You can, however, reschedule it at a different time through the SimEventList.reschedule method.
- It is perfectly legel if multiple SimEvents are scheduled at the same time. On a DefaultSimEventList they are processed in random order.
- With each SimEvent, an action is associated that determines what to do when the event is processed by the event list. The generic type in jsimulation is SimEventAction. Unlike

SimEvents, SimAction need not be unique on the event list, and can be shared among different events.

- Once sufficient events have been scheduled, a simulation experiment starts by running or processing the event list. In jsimulation, you can run the SimEventList until it is exhausted of events through the SimEventList.run method, until it has reached a specific simulation time through the SimEventList.runUntil method, or on an event-by-event basis through SimEventList.runSingleStep.
- A SimEventList keeps a notion of simulation time. It is available through SimEventList.getTime. While running, this is always the scheduled time of the current event being processed. When not, it is always smaller than or equal to the time on the first scheduled SimEvent.
- You cannot schedule (at the risk of an Exception) a SimEvent with time strictly smaller than the current simulation time on the SimEventList.
- Event may be scheduled simultaneously, in which case their order of processing is random.
- Events may be scheduled at  $t = -\infty$  and  $t = +\infty$ .
- The SimEventList.reset and SimEventList.reset (double) methods reset the event list, meaning all scheduled SimEvents are removed from the list, and the time on the event list is set to its default time (first method) or given time. The typical use case of these methods is running the simulation again (for instance, for variance-reduction purposes). You cannot invoke either method while the event list is being processed, at the risk of an Exception.

# **Entities**

In the previous chapter we introduced the core concepts of jsimulation; in the present chapter we delve into jqueues, and explain it center of gravity, viz. (simulation) entities. Other fundamental concepts in jqueues like queues and jobs, both of which are actually specific manifestations of entities, are described in subsequent chapters, as well as specific implementations of listeners.

Even though this chapter is quite abstract and deliberately kept compact, its contents are crucial for understanding core simulation concepts like *queues* and *jobs* in later chapters. Once you understand entities properly, we can describe queues and jobs in a highly compact, precise and almost mathematical, form. We therefore strongly recommend to take the time to go through this chapter before "jumping into" the admittedly more interesting later chapters on queues on jobs, and to return to this chapter if things are unclear later on.

# 5.1 Anatomy of a Simulation in jqueues

Our starting point for a detailed description of the jqueues package, is its vision on a *simulation* run; a concept already described for jsimulation in Chapter 4. We recall that in a discrete-event simulation, the *events* on an *event list* are processed one at a time in order of non-decreasing *event time*. The processing of an event involves the invocation of the event's *action*, which in turn may result in the scheduling of new events (in the future) on the event list. A simulation ends when there are no more events scheduled on the event list<sup>1</sup>.

In jqueues, we (have to) narrow this view. In particular, we assume that in a discrete-event simulation (run), we are primarily interested in a specific subset of objects affected by events. In jqueues, these objects are called *simulation entities* and are characterized by their implementation of the SimEntity interface. There may be many more Java objects that are affected by the scheduled events, for instance, for logging, reporting or presentation purposes, or for statistical analysis, or for workload generation, but our *main interest from the problem domain is in the (modeled) entities*.

The crux is that a SimEntity has a well-defined *simulation state* that can change *only* as a result of processing events. However, these events cannot arbitrarily manipulate the state a SimEntity; they can only do so by invoking *entity operations*. An operation is a well-defined method, or set of methods, on an entity that (potentially) changes its state. In jqueues, the type use for operations is SimOperation, but you will hardly need this in practical simulations. Each entity type comes with its specific *minimal* set of admissible operations. For instance, every queue and job, both of which are entities, must support the Arrival operation.

An operation on a SimEntity is either external or internal. The former can be scheduled

<sup>&</sup>lt;sup>1</sup>Or until some other criterion is met; see Chapter 4.

by the end-user, whereas the latter can only be scheduled by the entity itself. For instance, for queues, Arrival is an external operation, whereas Departure is internal.

All entities support the notion of a reset state, which is the state<sup>2</sup> they attain upon creation, or after a so-called entity reset. The reset state is well defined for each entity type; for queues, for instance, the reset state requirements mandate that the queue is empty. Performing a reset on an entity is a feature typically needed when running a simulation multiple times with the same set of queues (or even jobs), for instance because a certain accuracy has to be achieved (often with variance-reduction techniques like replication). Because the semantics of an entity reset are rather complicated, and many simulation studies do not need it (because they simply perform a "single-run"), its detailed discussion is deferred. Nonetheless, it is important to realize that every entity supports a well-defined reset operation.

Finally, simulation entities are required to maintain a set of *listeners* interested in state changes of the entity. So, whenever the state changes of an entity, all of its registered listeners are informed.

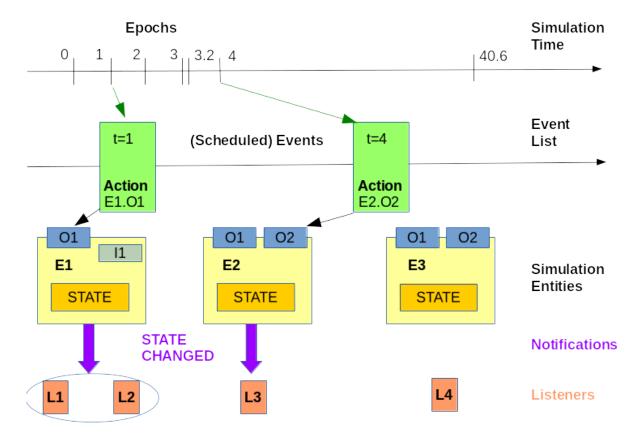


Figure 5.1: The anatomy of a simulation in JQueues.

In Figure 5.1, we attempt to explain the jqueues concepts and features described thus far. In the top two rows we show the by now hopefully familiar concepts of *epochs*, *simulation time*, *events*, and *actions*. The event list contains two events, one scheduled at simulation time t=1 and one at t=4. The former's action is to invoke operation 01 on entity E1, whereas the latter invokes 02 on E2. After the effect of invocation of E1.01, while the event list is being processed, entity E1 notifies its registered listeners L1 and L2 through a STATE\_CHANGED notification. Similarly, E2 notifies L3 after completing its 02 invocation from the event list.

<sup>&</sup>lt;sup>2</sup>In the sequel, whenever we refer to "the state" of an entity, we always mean its "simulation state".

# 5.2 The SimEntity Model in More Detail

In the present section, we refine the SimEntity model introduced in the previous section. In Figure 5.2, we illustrate the detailed model of a SimEntity. We will use this figure in our explanations of the more advanced concepts in the next sections.

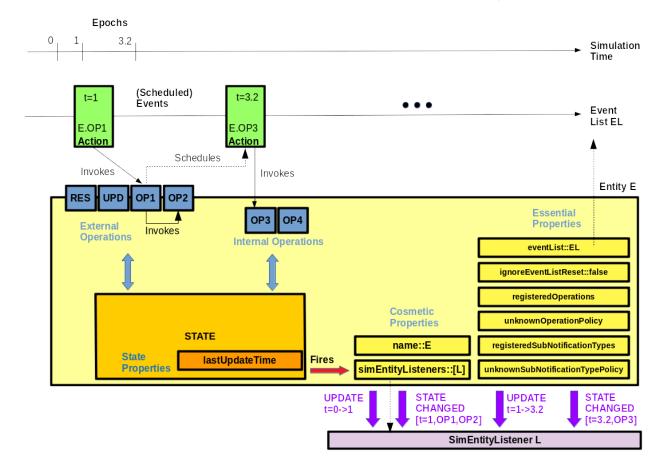


Figure 5.2: The detailed model of a SimEntity.

#### 5.2.1 Top-Level and Chained Operation Invocations

When a SimEvent (or, more precisely, its SimEventAction) calls a method on an entity corresponding to one of its operations this is called a *top-level operation invocation*. It is perfectly legal for an entity implementation to invoke *other* operations on it while performing an operation, i.e., still within the context of the event that triggered the top-level operation invocation, and such invocations are called *chained operation invocations*.

Why is this distinction important? Well, the golden rule in jqueues is that only state changes due to top-level operation invocations on an entity must be atomically reported to that entity's listeners, and only (obviously) after the operation has completed. It sounds complicated, but we think it makes more sense than to report each individual operation invocation, probably exposing an inconsistent state of the entity.

In Figure 5.2, at t=1, E.OP1 is invoked from the event list, so this invocation is a top-level one. However, while E.OP1 is being processed, the entity invokes E.OP2, which is therefore a chained invocation. It is crucial to understand that while E.OP1 also schedules the invocation of E.OP3 at t=3.2, the latter when processed will be a top-level invocation on its own. Referring to the lower right part of the figure, a listener thus receives a mandatory UPDATE notification at t=1, indicating a non-trivial progress of time (from t=0 to t=1; we silently assumed that

the simulation starts at t=0) without state changes. It then receives a single STATE\_CHANGED notification from the E.01 invocation at t=1, but notification holds both E.01 and E.02 as sub-notifications, because E.02 was invoked from within the context of E.01. Their joint effect on the state is thus described in a single atomic notification.

#### 5.2.2 Top-Level Notifications and Sub-Notifications

In the previous section we learned that entities are obliged to report state changes atomically. On order to avoid potential confusion, we need to properly introduce some notification-related terminology.

A top-level notification is the invocation of a method on the registered listeners of an entity. There exist only the following three types of top-level notifications:

- RESET: The entity has been put into its reset state, either because its underlying SimEventList was reset, or because its Reset operation was invoked. A RESET notification is equipped with the *old* time, i.e., the time *before* the reset, and the *reset time*, i.e., the *new* time on the entity<sup>3</sup>. It is important to realize that a RESET notification is the only one allowed to "set back" the time on the entity, and that it is only issued as a result of the invocation of its Reset operation, typically induced from resetting the event list. Hence, a RESET notification is *not* issued upon construction of the entity, *not* upon its attachment to a SimEventList.
- UPDATE: The entity is *about to* change its state because an operation on it was invoked, and it exposes *its old state* and the time at which the update occurs. The UPDATE notification primarily targets statistics-gathering listeners that need to know the interval length during which the entity's state remained constant.
- STATE\_CHANGED: The entity has been subject to the external invocation of one of its operations, and it exposes its *new* state and the time at which and the manner in which the new state was reached. The description of the transformation of the old state into the new one is done through a sequence of *sub-notifications* described below. A STATE\_CHANGED notification is not issued when the entity has been reset.

Note that there is no dedicated Java type for top-level notifications, simply because at the present time, we see no purpose in extending the current three-sized set of top-level notifications.

A *sub-notification* is a precise description of an aspect of an entity's state transformation. For the purpose of this description, it is always part of a top-level STATE\_CHANGED notification. So, in itself, a sub-notification is incomplete. However, it unambiguously reports a state transformation, and the state's a priori and a posteriori conditions. So given an entity's state (that is valid) and a sub-notification, one can always predict the new state of the entity. Often, it just takes multiple sub-notifications in sequence to describe a STATE\_CHANGED notification, which explains their existence.

A sub-notification is a tuple of its *type*, an object implementing SimEntitySubNotificationType, and its arguments. The actual type of a sub-notification defines its required arguments and their structure. By default, a SimEntity can only emit sub-notification types in a STATE\_CHANGED notification that have been *registered* at that entity. The process of registering sub-notification types is taken care of in the constructors of the various SimEntity sub-types and concrete implementations.

<sup>&</sup>lt;sup>3</sup>See the description of the lastUpdateTime further in this chapter.

#### 5.2.3 Properties

In jqueues, we adopt the notion of object *properties* from JavaBeans, and we silently assume that the reader is familiar with the basic concepts of JavaBeans. We follow the propertynaming conventions, and in jqueues, we only use property names starting with a lower-case letter.

For any SimEntity, we classify its properties as follows<sup>4</sup>:

- State Properties are part of the entity's simulation state; their values can only change as a result of the invocation of registered operations on the entity. You should never (attempt to) set them directly from user code. For a queue, for instance, the set of currently visiting jobs is a state property.
- Essential Properties are not part of the entity's simulation state; they do, however, affect the functionality of an entity's operations, and the entity assumes that their values remain constant while running a simulation. Hence, their values can only be changed under certain conditions, and certainly not (by whatever means) while running a simulation. The buffer size of FCFS\_B, a FCFS queueing system with finite buffer space, is an example of an essential property, because its value decides whether or not an arriving job is dropped in the presence of jobs present. In other words, it affects among others the Arrival operation.
- Cosmetic Properties are *not* part of the entity's simulation state, but unlike essential properties, their values can be changed at any time without affecting the simulation state of the entity or the functionality of any of its operations. Their values may even be changed from an event. The name of an entity is a cosmetic property; its value, by contract, never affect the state of the entity nor the functionality of its operations.

Note that many sub-types of SimEntity put even stronger restrictions on setting an essential property. In many cases, you can only set it *upon construction*, or only *immediately after a* Reset operation.

## 5.3 Mandatory Properties of a SimEntity

In Table 5.1, we list the mandatory properties of a SimEntity, classifying them into state, essential and cosmetic properties introduced previously.

The only mandatory state property is lastUpdateTime holding the (a posteriori) simulation time of the last (invocation of the) Update or Reset operation, whichever occurred last. Note that upon construction, a SimEntity always enters its reset state, which sets the initial value of lastUpdateTime. This implicit Reset, however, is *not* notified to listeners because there cannot be any.

Among the essential properties are registeredOperations and registeredSubNotificationTypes, reporting the registered operations and notification sub-types, respectively. Typically, implementations will return unmodifiable views on the underlying collections. There are also essential properties that govern a SimEntity's behavior when an unregistered operation on it is invoked, or when its implementation asks for the emission of a sub-notification it does not know. Both features are of little practical use, except perhaps for testing purposes. Last but not least, the simEventList property holds the event list to which the entity is attached. Typically, the

<sup>&</sup>lt;sup>4</sup>This classification is jqueues-specific; it is not part of JavaBeans.

<sup>&</sup>lt;sup>5</sup>In fact, SimEntitySimpleEventType.Member.

 $<sup>^6</sup>$ UnknownSubNotificationTypePolicy.

Table 5.1: Mandatory properties of a SimEntity.

Name	Type	Default/Reset
	SimEntity	
State Properties		
lastUpdateTime	double	From eventList; $-\infty$ if absent.
Essential Properties		
eventList	SimEventList	From constructor; may be null.
ignoreEventListReset	boolean	false.
registeredOperations	Set <simentityoperation></simentityoperation>	Sub-type-dependent; set in constructor(s).
$\verb"unknownOperationPolicy"$	UnknownOperationPolicy	ERROR; settable by user.
registeredNotificationTypes deprecated	Set <member><sup>5</sup></member>	Sub-type-dependent; set in constructor(s).
registeredSubNotificationTypes $since \ r5.3$	Set <subnotificationtype></subnotificationtype>	Sub-type-dependent; set in constructor(s).
unknownNotificationPolicy deprecated	UnknownNotificationPolicy	ERROR; settable by user.
$unknownSubNotificationTypePolicy\\since~r5.3$	${\tt UnknownSubNotPolicy}^6$	ERROR; settable by user.
Cosmetic Properties		
name	String	null.
simEntityListeners	List <simentitylistener></simentitylistener>	Empty List.

event list is passed to the constructor of concrete SimEntity implementations, and setting it properly is actually mandatory for certain sub-types like queues (SimQueue). However, if a SimEntity is attached to a SimEventList, the former will register at the latter and automatically perform a Reset upon a reset of the event list. This behavior is controlled through the ignoreEventListReset property, but this should never be changed by user code; it is strictly meant for implementation use.

The two mandatory cosmetic properties on a SimEntity are its registered listeners (simEntityListener which will be described in more detail in the next section, and its name. Despite being a "cosmetic" property, setting the name of a SimEntity is often quite important. Typically, if you do not set it, implementations of SimEntity will use a type-specific String for the toString method; otherwise, they will supply the value of the name property. So, if you are studying a single queue like FCFS, there is really no need to set its name; its default toString representation will be "FCFS", which is clear enough. If, however, you use multiple queues of the same type, or if distinct individual identification is required of the jobs (SimJob) the queue(s) is/are subject to, it is highly recommended to set the name property accordingly. (Another, implementation-driven argument for this approach is that end users can set an entity's name even if the implementation is final. On such implementations, one clearly cannot override toString.)

## 5.4 Registering and Unregistering Listeners

As stated previously, a SimEntity must always report state changes atomically to each registered listener. In jqueues, such listeners have type SimEntityListener, and they can be registered and unregistered at any time on a SimEntity through the registerSimEntityListener and unregisterSimEntityListener methods, respectively. The set of currently registered listeners of an entity is available through its simEntityListeners property, which is a cosmetic property and thus not part of the entity's state.

# 5.5 Mandatory Operations on a SimEntity

Every SimEntity must support the following operations, all of which are external:

- Reset: This operation puts the entity into its reset state, and sets its lastUpdateTime property to the time argument provided. It is the *only* operation allowed to "set back" the time on the entity. The RESET operation is not meant to be invoked directly from user code. If the SimEntity is attached to an event list, through its simEventList property, it will reset itself automatically when the attached event list resets. A SimEntity will issue a UPDATE notification first when its Reset operation is (explicitly) invoked, and after completion, it will notify its listeners with a RESET notification. Upon construction, a SimEntity always enters its reset state, possibly overriding state-property values (directly or indirectly) from the constructor arguments. This is an implicit invocation of Reset which is not reported to listeners.
- Update: This operation sets the lastUpdateTime property on the entity from the time argument supplied, and notifies listeners through the UPDATE notification, providing both a priori and a posteriori simulation time. It never modifies state properties other than lastUpdateTime.
- DoOperation: This "meta operation" invokes the operation provided as argument. The operation has to be registered at the SimEntity; if not the behavior of the entity is

controlled by the value of its unknownOperationPolicy property. The operation-specific arguments have to be provided as well.

## 5.6 Summary

In this chapter, we introduced the core concept of jqueues, viz., SimEntitys. Below, we summarize the contents of this chapter:

- In jqueues, we are primarily interested in the behavior in simulation time of objects named (simulation) entities.
- Simulation entities model objects from the real-world problem domain; they are represented as SimEntity Java objects. Queues and jobs are typically instantiations of entities.
- A SimEntity has a well-defined *simulation state*, which is a subset of the Java object state. The simulation state can only change as a result of the invocation of registered SimOperations on the entity.
- The invocation of an operation on a SimEntity from the event list is called a *top-level* operation invocation. Such invocation may induce the invocation of other operations on the SimEntity; these are called *chained invocations*.
- A SimEntity processes and reports its top-level operation invocations *atomically*. The reports of state changes are through STATE\_CHANGED notifications, which consists of a sequence of *sub-notifications* each describing a specific, well-defined, transformation of the entity's state.
- Like operations, sub-notifications need to be of a known type, well documented, and registered at the SimEntity.
- A SimEntity exposes its Object state through JavaBeans properties. A property can be a *state* property, representing an aspect of the entity's simulation state, a *essential* property, having dominant effect on the behavior of operations, or a *cosmetic* property, which does *not* have that effect.
- Each SimEntity must support the Reset, Update and DoOperation operations.
- Each SimEntity must support the RESET, UPDATE and STATE\_CHANGED top-level notifications.

# Bibliography