Models can help to understand the performance aspects of a computer system from the software architecture and its configurations, but ease of model creation is critical. A compositional model-building approach is described here, in which component submodels are generated from the scenarios they participate in. Submodels classes are derived from an analysis of behaviour patterns as the scenarios traverse the software components. Then submodels are instantiated and combined in the overall system model. The approach is particularly effective in peer-to-peer systems in which subsystems inherit most of their behaviour from a few shared patterns, termed “Behaviour-Inheriting Peer” (BIP) systems. A model-building algorithm is described, and is demonstrated on a prototype emulator for a network of routers. The emulator, called CGNet, can be configured for its deployment and for traffic patterns and routes. An automatic model-generator uses this information to build a model which represents the overall system configuration. The approach is quite general and can be used to model component-based systems in which the components themselves are created in many configurations.

Index Terms—Software performance engineering, Performance modeling, Use Case Maps (UCM), Layered Queueing Network (LQN), Component-path sub model, Path class, Generative modeling, Component sub model, Peer-to-peer systems.

1. Introduction

There can be many advantages to modeling the performance of a software system, as documented by Smith [Smith90, Smith02] and others, however the process of building models may be lengthy and expensive. The present work sets out to automate the building of models, for a class of systems that can be deployed in many different patterns and at large or small scales.

The class of systems has sub-systems which are similar to each other, with similar behaviour, such as peer-to-peer systems or grid applications. An example which is studied here is a network of routers. The class will be called “Behaviour-Inheriting Peer” systems because the node behaviours are inherited from a small set of behaviour classes. Automation is essential for building models of large scale systems, because the effort of creating a model directly is prohibitive. Automation is valuable also for smaller deployments if there are many instances to be modeled and compared.

Performance models for computer system and networks, and for software, can be built using various approaches, as described in texts by Jain [Jain91], Bolch et al [Bolch98] and others. They can be grouped into methods based on queueing networks and their extensions, such as layered queueing networks [Woodside95a] and methods based directly on states and transitions (Markov models) and their extensions such as stochastic Petri nets (e.g. SPNP [Ciardo89]). They are solved by analytic techniques, numerical methods or simulation. Direct simulation without a formal modeling framework is a third category of tools.

Smith advocates an approach to building these models based on system behaviour or scenarios, which she calls execution graphs [Smith90, Smith02]; other approaches are based on structural relationships and summary workload statistics [Jain91]. Cortellessa and Mirandola [Cortellessa00] describe how to use UML sequence diagrams to derive execution graphs and then queueing models. This work follows the scenario approach.

In this paper scenarios expressed by Use Case Maps (UCMs) are used to generate Layered Queueing Network (LQN) models [Rolia95] [Woodside95a]. Model-building directly from UCMs to LQNs was described in [Petriu02], however the present work avoids creating a complete UCM. Instead it exploits repetitive common behaviours, and generates component submodels based on object behaviours in the software and local UCM sub-paths in a component. It extracts advantages from the use of object-oriented design and component-based software.

Innovations in software such as object-oriented design make performance modeling more complex. The interactions between objects are numerous and are obscured by inheritance, polymorphism, and late binding, making them difficult to trace. Also, distributed systems challenge performance intuition by introducing middleware layers, network latencies and message effects such as blocking delays. All these make it difficult to construct performance models especially for a large systems with lots of interaction and communication. However the re-use of behaviour patterns also provides opportunities.

Component based software systems (e.g. [Szyperski98])
are designed to re-use software components, and provide an opportunity to model the components and re-use these performance sub-models. Strategies for doing this are described in [Wu03a] [Bertotino03]. However in many systems the components are configurable and do not have a single structure or a single performance sub-model. To build a performance model from components we must first create suitable component submodels for the particular application, and that is the role of this research. The submodels can be re-used just as the corresponding software components are re-used in the system.

In this paper we begin with the software architecture, and we express the scenarios of the system in terms of Use Case Maps (UCMs) [Buhr96] that show paths and responsibilities over components. Then we build submodels corresponding to scenario fragments. At last we use the compositional strategy to assemble the submodels into a model for the entire system. A modest-sized deployment of a system called CGNet [Hobbs01] is used as a case study to demonstrate the compositional approach. It reduces the complexity of building the performance model so that the approach can be scaled up to virtually any size of system.

The compositional strategy is defined in Section 3 below, following some background on the models and notation in Section 2, and it is applied to CGNet in Sections 4 and 5.

2. Models and notation

This work uses Use Case Maps (UCMs) to describe scenarios, and Layered Queueing Networks (LQNs) to model performance. UCMs are a visual notation for use cases [Jacobson92] with additional detail about responsibilities and components. They can be used to reason about architecture related to Use Cases [Buhr96], and to create performance estimates [Petriu02]. An example UCM is shown in Figure 1, with a scenario indicated as a line from a start point (a filled circle) to an end point (a bar). Responsibilities (crosses) indicate operations to be performed, and can be refined by a submap. Responsibilities are contained in and implemented by components, shown as boxes. Components can represent any structural unit, from a subsystem with many processors down to an object or procedure. Components can be nested and in the Figure the inner components with solid lines are called “tasks” T1 to T5, and in this case represent processes, while the outer components C-A, C-B, C-C are just called “components”. Each of these outer components is loaded on a different processor P-A, P-B, P-C respectively.

The performance model used here is a kind of extended queueing network called a Layered Queueing Network (LQN), with servers to represent processors and other devices, and also servers to represent software tasks. Layered queueing arises when a software server task has to wait for service at its processor, or at another task. Figure 1 also shows the tasks and the requests for service that are implied by the UCM, with one sub-model for each scenario. Tasks are indicated by rectangles, divided into a field for the task and its properties, and fields for entries which provide classes of service. The entries have been named for the first responsibility they perform. In S1, entry a makes a request to entry b and waits for the reply, this kind of

3. Scenario-based generation and composition of submodels

The model-building approach is based on the distributed software objects and on overall scenarios (that is, UCMs) describing the end-to-end system behaviour for different inputs. Scenarios can be constructed based on the system requirements and design. The types of requests can be described as Use Cases, and the processing of each is traced as a sequence of high-level operations, identified in the UCM as its responsibilities. The operations are allocated to

![Figure 1. A Use Case Map with two scenarios, and their LQN submodels](image-url)
software task components, and other resources required are also identified as UCM components (the path enters the component to obtain the resource, and leaves to release it). For early analysis, the scenarios can be based on the documentation and the expertise of the developers [Smith90]; later, they can be based on tracing the execution of the code.

We assume that the system is divided into a set of large grain subsystems, and from here on the term “component” will be reserved for these; each of them will generate a component submodel in the overall performance model. They may be subsystems with internal concurrency. The approach is particularly suitable when the system has many of these components and each one includes several tasks and a large number of responsibilities. It is particularly simple and efficient when each component is assembled from tasks and operations which are variations on a small number of basic tasks and operations, as in the router example later.

Object-oriented design promotes re-use not only of data structures, but also of behaviour. This is particularly marked in systems with peer components based on the same set of classes, and with strongly similar functionality; their behaviour is inherited from the common classes. We will call these “Behaviour-Inheriting Peer” (BIP) systems. A set of internet routers with identical code is an example. The objects in each router may be instantiated differently to conform to its configuration, but their behaviour comes from common classes.

**Strategy A, for a system defined explicitly by a set of scenarios:**

Strategy A does not make any assumption about similar behaviour in different components.

1. Optionally define the system-wide scenario for each request, as just discussed;
2. Decompose each scenario into fragments at the component boundaries, so there is a set of “component-path” scenario fragments in each component. For a system with many components, it may be preferable to begin with this step, and avoid creating the very large UCM of step 1.
3. Map each fragment into a partial LQN model called a “component-path submodel”, representing the system behaviour for that fragment.
4. For each component, create a component sub-model, as follows:
   1. Collect the component-path sub-models into one sub-model for each component to identify the types of component-method scenarios, and define them as classes of scenarios. For each one, create an LQN sub-model class. Identify parameters that may be different in different instantiations of a component-path scenario. Parameters may include the identity of software elements and system nodes.
   2. From the system specification and the role and workload of each component, identify its component-path scenarios by class, and their parameters if any.
   3. Generate the set of component sub-models as instances from the sub-model classes.

Then follow steps 4 and 5 for Strategy A.

The case study which follows will be modeled using strategy A for a particular configuration, to explain the ideas, and also discusses how the library of sub-model classes is created. Then the tool created for modeling the family of systems uses Strategy B, to cover the wide range of variations that are possible.

**Strategy B, for Behaviour-Inheriting Peer (BIP) systems:**

In Strategy A, replace steps 1, 2, 3 by

1. Analyze the software objects and their behaviour within each component to identify the types of component-method scenarios, and define them as classes of scenarios. For each one, create an LQN sub-model class. Identify parameters that may be different in different instantiations of a component-path scenario. Parameters may include the identity of software elements and system nodes.
2. From the system specification and the role and workload of each component, identify its component-path scenarios by class, and their parameters if any.
3. Generate the set of component sub-models as instances from the sub-model classes.

**4. Case study on CGNet**

In this section we illustrate the approach described above by applying it to CGNet, which is an example of a BIP system. CGNet [Hobbs01] is a network emulator which includes routers (nodes), sources (generators) and destinations (sinks) for the traffic, and is configured with a connection topology with stated link capacities. There is a generator for each node, which sends it packets for different
destinations at pre-configured rates. The packets traverse
the path specified in the routing table to a traffic sink, which
consumes the packets.

Here we treat a router node as a component; the generator
is modeled as an arrival process and the sink is modeled by
a dummy “user” task.

Every node has the same operations: the main thread
receives packets from the incoming sockets, parses packets
and switches them to the outgoing queues. The sending or
sinking thread sends packets to outgoing sockets; the
sending thread also emulates the network interface delay for
the link.

The case study will consider a configuration of CGNet
with five nodes to explain the compositional model-
building approach. The topology is shown in Figure 2. Data
packets start from a generator (triangle) and end at a sink
(square). They traverse the routers (circles) along the paths
defined in the routing table.

The traffic is made up of classes, according to the route
followed. For the packet class named as (XX, ZZ), node XX
is the source router that is connected to its generator; node
ZZ is the destination router that is connected to the traffic
sink. XX and ZZ will be replaced by the two-letter names of
the router nodes shown in Figure 2. There may also be
forwarding routers along the path between XX and ZZ; we
will designate such a router YY. Each packet class has its
own scenario; Figure 3 shows the path view [Woodside95b]
of the scenario for class (AT, CH), showing the path and
responsibilities described above overlaid on the components
shown in Figure 2.

For further analysis we have defined three different roles
for the component-path scenario fragments. They are source,
forwarding, and destination roles. The role will affect
which sub-model class is instantiated, for the component
sub-path.

Every component sub-path does the same overall
operation, to handle a packet. There are three variations,
which we will call handleXX, handleYY and handleZZ, for
the handling done by a source, forwarding and destination
node respectively. Each of these is a component-path class,
and they give the sub-model classes smXX, smYY, and smZZ.
They can be instantiated by providing node names to replace XX, YY and ZZ. As a first example, Figure 5 shows handleXX as a UCM fragment and smXX as a LQN submodel. This class has a parameter YY, which is the name of the next node in the route followed by packet class (XX, ZZ) from node XX. Notice that one node has component-path fragments with different roles, for classes that are originated, forwarded or have their final destination at that node.

The sub-model structure is obtained partly from analysis of the code. There is a thread for receiving packets, and a thread for each outgoing interface, and these threads are modeled by LQN tasks. The switching and routing is also modeled by a task, which later will be aggregated into Receive. When it receives a packet the software reads it from a socket, so in smXX, the receiving task responds to an asynchronous call. Once the packets are received to the workspace, the switching procedure performs switching/routing according to the routing table before another packet can be received. Thus the call from receiving task to the switching task in smXX is synchronous. Once the packet is stored in the outgoing queue, the receiving and switching tasks are no longer blocked, so the entry in the switching task makes an asynchronous call to the entry of the sending task. In the program, the sending thread triggers an emulation of the network delay and is blocked during this time, so a synchronous call is used from the sending task to the delay task, which represents an operating system timer. The sending thread writes the packets to the outgoing socket and does not wait for a reply from the next hop. So from the network delay task to the receiving task of the next component the call is asynchronous. Thus the requests between components (nodes) are all asynchronous.

For a component-path fragment with a forwarding role the operations are identical, as shown in Figure 6 for operations at node YY to forward packet class (XX, ZZ). The only difference is that on instantiation, the input is bound to a predecessor node in the path instead of to the local packet generator. For a destination role, there is a difference shown in Figure 7. The call from Switch goes to Sink rather than to Send, and there is no network delay emulation.

**Applying the steps for node AT**

Consider the node Atlanta (AT) and the steps for deriving its component sub-model from the LQN submodel classes. Necessary information is retrieved from the routing tables in node AT and connected nodes DA and WA.

**First** we consider packet classes that originate at AT. From the routing table in node AT we find it is the source of 4 packet classes (AT, CH), (AT, DA), (AT, NY) and (AT, WA). Class (AT, DA) chooses node DA as its next hop, while all the others choose node WA as next hop. We create four instances of the component-path sub-model class smXX in Figure 5, replacing XX by AT, ZZ by the destination of the class, and YY by the node which is next in each route. This gives four component-path sub-models for AT.

**Second**, we consider packet classes that terminate at AT. The nodes connected to AT are DA and WA. From the handleZZ and smZZ class definitions in Figure 7 it is clear that the source of the packet class has no effect on the processing of a packet coming from either one, so just two
component-path sub-models are created from the class in Figure 7, one with YY replaced by DA, and one with YY replaced by WA.

Third, we can consider classes which are forwarded by AT, however in this configuration there are none. If there were, the LQN sub-model class in Figure 6 would be instantiated.

The resulting collection of sub-models are then merged together using step 4 of Strategy A, to give the component sub-model for the Atlanta node shown in Figure 8. The merging of tasks and entries is done as follows. (1) All packet classes coming from the generator wait in a queue located in the same incoming socket. Step 4.2 merges all the entries of the receiving task coming from the generator. (2) One switching task is created for each incoming socket, combining the entries that handle its packet classes, in step 4.2. (3) Because node AT does not take account of the source node origins of packet classes (XX, AT), the entries for all classes ending at AT are merged into one entry in the switching task by step 4.3. The same reason gives one entry in the sinking task that sends them to the sink at AT. (4) The routing table in AT indicates that packet classes with the destinations CH, NY, and WA should go through the link ATWA. All these packet classes should wait in the same outgoing queue for the outgoing socket. Step 4.2 creates one sending and network delay task for these classes.

This gives the sub-model nodeAT for the Atlanta node, shown in Figure 8. The complete network node includes the router node component nodeAT, the processor ATServer and a user pseudo task ATUserTask to receive packets from local generator. The next step is to combine the node sub-models into a system model.

To create a complete system model, the component sub-models for the nodes must be joined together. For this step it is useful to define a high-level view of the components seen from outside, showing their interfaces. Figure 9 shows nodeAT as a box with plug-in points (circles in boxes) for the interfaces (input interfaces at the top, and output at the bottom). The interfaces are labelled as `<link, list of classes>`, where the link is named for the two nodes that it connects, in the order source-destination. The link gAT is the link from the generator to the node, and its classes are all traffic originating at AT. The input and output interfaces connected to another node are shown separately, even though they are provided by the same socket in the prototype.

By the same procedures we can obtain component sub-models for all nodes, and they can be shown in the same way. Then their interconnection is illustrated in Figure 10.

To construct the overall LQN model, calls are inserted between the component sub-models. Where an output interface is connected to an input interface, the call made from the sending object is merged with the call received by the receiving object. The interactions that are merged must...
be of the same type (here, we have seen that they are all asynchronous). The system-wide LQN model is too complex to show here.

An LQN model is incomplete without processor execution demand parameters, giving the demand for each call to an entry. In this case we used the fact that each entry call is associated with operations on one data packet. It is straightforward to measure the total execution demand at a node and allocate it per packet. However each packet is handled by two concurrent threads, one to receive and switch, and one to send and emulate network delay. It would be better to estimate these separately, to see if the nodes are bottlenecked at receive or at send; this can affect the location of buffer overflow.

5. Experiments on the CGNet model

Experiments were performed with each node running on a separate Unix workstation, all of the same type. The total CPU time for all packets handled at each node was recorded, and the number of packets that arrived and were sent (they were not the same when buffers overflowed). The CPU time for each node was split into amounts for sending and receiving by fitting parameters, using least squares regression (see e.g. [Scheaffer86] for a discussion of regression, and [Wu03b] for details of its application). The resulting execution demand of receiving and switching is 0.0016 sec, and for sending or sinking it is 0.0018 sec. The network delay emulation derived from configuration files was taken to place execution demand on the network processor. Overhead and message handling execution are included in the two parameters.

When the model is compared to measurements, it gives results for utilization shown in Figure 11(a) and for throughput, shown in Figure 11(b). For the model the confidence interval is plotted as (LCL, UCL) and all the predicted values lies in this confidence limits. The horizontal axis shows a multiplier on the workload intensity, which was defined by a profile of arrival rates for different classes. The agreement is good when the workload is low (no packet loss), and less good for the cases where there is packet loss. The model solutions by simulation appear to drop packets a bit differently from the real system CGNet; this is being investigated. The full results are beyond the scope of this paper, but this sample indicates that (with this limitation in representing loss) the strategy generates a realistic model. Also, in cases that were simple enough to generate models by hand, the strategy gave the same model.

CGNet can be configured in many different ways, with different numbers of nodes and different connections and emulated link capacities. The configuration and its workload and routing tables are all driven by data which has been used as input to a Converter Tool, implemented to automate the process of model generation. As illustrated in Figure 12, it uses the configuration data to create the model structure with the compositional approach, and then adds the (assumed) known parameters for the execution demands.
Figure 12. The overall approach to building the LQN model from the CGNet configuration

6. Conclusions

An approach has been defined for building performance models of complex systems with non-repetitive structure, but with components based on the same software objects and executing a few strongly related behaviours. These were called BIP ( Behaviour-Inheriting Peer) systems. The model is created by instantiating sub-models that represent classes of behaviour, and then by composing them in two stages, first to create a submodel for each component, and then to create the overall system model. This approach can model arbitrarily large configurations without the need to program the simulations. For CGNet, a prototype tool to emulate a network of routers, a Converter tool was developed to automate this process. From the data required to configure CGNet, a performance model can be created also. The accuracy of the CGNet model appears to be good, except when it is limited by the modeling platform’s handling of packet losses.

The Converter tool has achieved, for models of systems generated from CGNet, the goal of configuration-driven modeling described in [Wu03a] [Bertolino03]. The Converter tool can build a performance model for a CGNet configuration of any size, for essentially zero additional effort by the analyst. The effort necessary to support this capability is to create the behaviour and path sub-model classes, and to calibrate the demand parameters. If the software evolves, these model aspects must be maintained.

The same strategy should apply equally well to model other kinds of systems with strongly related components, such as peer-to-peer application systems, and grid systems. Submodels created by the BIP strategy described here can be freely combined with other submodels that are created by other means, to give a powerful and unconstrained modeling capability.

Acknowledgement

This research was supported by NSERC, the Natural Sciences and Engineering Research Council of Canada, and Nortel Networks, through the OCRI-NSERC Industrial Research Chair in Performance of Real-time Software.

References