

# Achieving Robust Self Management for Large Scale Distributed Applications using Management Elements

MUHAMMAD ASIF FAYYAZ



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The Royal Institute of Technology  
School of Information and Communication Technology

Muhammad Asif Fayyaz

## **Achieving Robust Self Management for Large Scale Distributed Applications using Management Elements**

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Examiner: Vladimir Vlassov,  
The Royal Institute of Technology (KTH), Sweden

Supervisors: Konstantin Popov and Ahmad Al-Shishtawy,  
Swedish Institute of Computer Sciences, Sweden



*This work is dedicated to my family who has always prayed for my success*



# Abstract

Autonomic computing is an approach proposed by IBM that enables a system to self-configure, self-heal, self-optimize, and self-protect itself, usually referred to as self-\* or self-management. Humans should only specify higher level policies to guide the self-\* behavior of the system. Self-Management is achieved using control feedback loops that consist of four stages: monitor, analyze, plan, and execute.

Management is more challenging in dynamic distributed environments where resources can join, leave, and fail. To address this problem a Distributed Component Management System (DCMS), a.k.a Niche, is being developed at KTH and SICS (Swedish Institute of Computer Science). DCMS provides abstractions that enable the construction of distributed control feedback loops. Each loop consists of a number of management elements (MEs) that do one or more of the four stages of a control loop mentioned above.

The current implementation of DCMS assumes that management elements (MEs) are deployed on stable nodes that do not fail. This assumption is difficult to guarantee in many environments and application scenarios. One solution to this limitation is to replicate MEs so that if one fails other MEs can continue working and restore the failed one. The problem is that MEs are stateful. We need to keep the state consistent among replicas. We also want to be sure that all events are processed (nothing is lost) and all actions are applied exactly once.

This report explains a proposal for the replication of stateful MEs under DCMS framework. For improved scalability, load-balancing and fault-tolerance, different breakthroughs in the field of replicated state machine has been taken into account and discussed in this report. Chord has been used as an underlying structured overlay network (SON). This report also describes a prototype implementation of this proposal and discusses the results.





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All praises to my GOD whose blessings on me are limitless.

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# List of Symbols and Abbreviations

DCMS	Distributed Component Management System
SON	Structured Overlay Network
YASS	Yet Another Storage System
ME	Management Element
RSM	Replicated State Machine
RME	Robust Management Element
RSMID	Robust State Machine Identifier
RMEI	Robust Management Element Identifier
RMERI	Robust Management Element Replica Identifier
MEI	Management Element Identifier
MERI	Management Element Replica Identifier
ACK	Acknowledgement
IP	Internet Protocol
Node	Physical Machine (Computer, Mobile etc.)
ACK	Acknowledgement
IP	Internet Protocol
VO	Virtual Organization
QoS	Quality of Services





# Chapter 1

## Introduction

Autonomic computing [1] is an attractive paradigm to tackle management overhead of complex applications by making them self-managing. Self-management, namely self-configuration, self-optimization, self-healing, and self-protection, is achieved through autonomic managers [2], which continuously monitor hardware and/or software resources and act accordingly. Autonomic computing is particularly attractive for large-scale and/or dynamic distributed systems where direct human management might not be feasible.

Niche [3, 4] is a distributed component management system that facilitates to build self-managing large-scale distributed systems. Autonomic managers play a major role in designing self-managing systems [5]. An autonomic manager in Niche consists of a network of management elements (MEs). Each ME is responsible for one or more roles in the construction of Autonomic Manager. These roles are: Monitor, Analyze, Plan, and Execute (the MAPE loop [2]). In Niche, MEs are distributed and interact with each other through events (messages) to form control loops.

### 1.1 Motivation

Niche intends to work in a highly dynamic environment with heterogeneous, poorly managed computing resources [6]. A notable example of such environments is community-based Grids where individuals and small organizations create ad-hoc Grid virtual organizations (VOs)

that utilize unused computing resources. Community-based grids are meant to provide “best-effort“ services to their participants, but because of the nature of their resources, it cannot provide more strict quality-of-service (QoS) guarantees [6].

In such a dynamic environment, constructing autonomic managers is challenging as MEs need to be restored with minimal disruption to the autonomic manager whenever the resource where MEs execute leaves or fails. A common way to make a service tolerate machine failures is to replicate it on several machines. However, replication can only mask a limited number of failures, and the longer the service runs, the more likely the failure count will exceed this number [7]. In addition to that, it is easy to achieve consistency in a replicated service with no changing states. MEs are stateful entities and they must keep their state consistent with other replicas. For the sake of this report, we will use the term `configuration` as a set of replicated MEs, while a `migration` is a change in this configuration. This change can be due to replacing failed machines with the new one or adding new machines into the system for load-balancing.

## 1.2 Problem Statement

Niche management elements should : 1) be replicated to ensure fault-tolerance; 2) survive continuous resource failures by automatically restoring failed replicas on other nodes; 3) maintain its state consistent among replicas; 4) provide its service with minimal disruption in spite of resource join/leave/fail (high availability). 5) be location transparent (i.e. clients of the RME should be able to communicate with it regardless of its current location). Because we are targeting large-scale distributed environments with no central control, such as P2P networks, all algorithms should be decentralized.

For implementing replication of MEs, we have decided to use SMART [8] which not only replaces failed machines by the new ones, but also adds new machines into the system using configuration change (migration) protocol. Although SMART claims to fulfill many of the limitations that other approaches have for migrating replicated state machines [8], yet there are some areas where the information is still very limited. SMART has been described and tested in an environment with 100 Mb/s Ethernet LAN as the underlying network. This is not enough

when analyzing the behavior of such a system in larger and dynamic networks e.g. DHT, CHORD. In addition to that, the experiments conducted by SMART used few nodes/machines in the system and the behavior of the protocol with large number of nodes is still unclear. Only one pseudo-code has been provided with the paper which proved to be much less information than for implementing a whole system. Furthermore, there is no practical implementation information available regarding the underlying protocol including Paxos [9] in such kind of migration scenarios. Last but not the least, the most important aspect of such a system is it's behavior in extreme conditions and high churn scenarios where multiple nodes can fail at the same time. There is no information about the behavior of the given system in such kind of environments.

### 1.3 Research Questions

Based on the problem statement in the previous section, here are some Research Questions (RQ) that this thesis work must attempt to address.

- RQ-01 :** Replication by itself is not enough to guarantee long running services in the presence of continuous churn. This is because the number of failed nodes hosting ME replicas will increase with time. Eventually this will cause the service to stop. Therefore, we use service migration [8] to enable the reconfiguration of the set of nodes hosting ME replicas. However, all this process should be self-automated. How to automate re-configuration of replica set in order to tolerate continuous churn?
- RQ-02 :** Reconfiguration or migration of MEs will cause extra delay in request processing. How to minimize this effect?
- RQ-03 :** Replication of MEs will result in extra overhead on the performance of the system. How to control this extra overhead?

- RQ-04 :** When a migration request is submitted and decided, according to SMART, on execution of migrate request, leader in the configuration will assign its `LastSlot`, send `JOIN` message to host machines in the `NextConf` and will propose null requests for all the remaining unproposed slots until the `LastSlot`. However, the solution is unclear if another configuration change request has already been proposed. It might happen, due to high churn rate, that multiple configuration change requests are submitted to the leader at the same time. If two configuration change will be executed by the same configuration, it could result in having multiple `NextConf` with the same `ConfID` i.e. duplicate and redundant configurations. How to avoid this scenario?
- RQ-05 :** How to make the system scalable i.e. how to control the system performance when it is overloaded and churn rate is high?
- RQ-06 :** How overlay node count effects the performance of replicated MEs?
- RQ-07 :** We have assumed a fair-loss model of message delivery. That means, some messages can be lost even when sending them to alive replicas. How to handle these lost messages.
- RQ-08 :** What are the factors other than replication and request frequency that can influence the performance of a replicated state machine?

## 1.4 Note About Team Work

The research presented in this thesis is not a product of the individual effort of the author of this thesis but rather a joint effort of a team of researchers from the Swedish Institute of Computer Science (SICS) and KTH the Royal Institute of Technology Sweden. In addition to thesis author, the team

includes Ahmad Al-Shishtawy, Konstantin Popov from SICS and Vladimir Vlassov from KTH. Most of the parts of this report has been taken from the paper [10], which includes the contribution from all the above mentioned authors. The main responsibility of this report's author was the prototype implementation, conducting experiments and evaluating results, however he was also part of other activities as well.

## 1.5 Thesis Outline

This report explains a generic approach and an associated algorithm to achieve long-living fault-tolerant services in a structured P2P environments. It also describes the implementation details and the results of the simulations conducted to evaluate the proposed algorithms.

The rest of this report is organized as follows: chapter 2 presents the necessary background required to understand the proposed algorithm. In chapter 3, we describe our proposed decentralized algorithm to automate the migration process. Followed by applying the algorithm to the Niche platform to achieve RMEs in chapter 3.4. In chapter 4 we describes our prototype implementation of the proposed system and discusses our experimental results in chapter 5. Finally, Section 6 presents conclusions and the future work.



# Chapter 2

## Background

### 2.1 Niche Platform

Niche [6, 3] is a distributed component management system (DCMS) that implements the autonomic computing architecture [2]. Niche includes a programming model, APIs, and a runtime system including deployment service. DCMS intends to reduce the cost of deployment and run-time management of applications by allowing developers to program application self-\* behaviors that do not require intervention by a human operator. Niche has been derived from Fractal Component Model [11] and provides a mechanism for defining the structure and deployment of the distributed application using Architecture Description Language (ADL).

#### 2.1.1 Niche in Grid4All

Niche has been developed as part of Grid4ALL project that aims to prototype Grid software building blocks that can be used by non-expert users in dynamic Grid environments such as community-based Grids. In these environments, computing resources are volatile, and possibly of low-quality and poorly managed. Because of the dynamic nature and ad-hoc, peer-to-peer styles of creating virtual organizations in community-based Grids, availability and consumption of computing resources cannot be coordinated. For achieving this vision, both the applications and the Grid must automatically adjust themselves to available resources and load demands that change over time, self-repair itself after hardware and software failures, protect themselves from

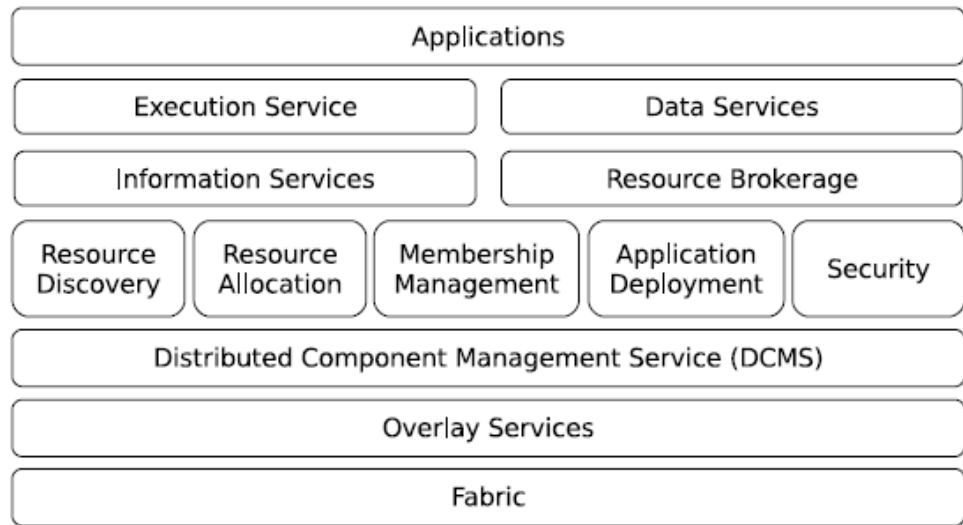


Figure 2.1: Niche in Grid4All Architecture Stack [6]

security threats, and at the same time be reasonably efficient with resource consumption [6].

### 2.1.2 Self-Managing Applications with Niche

Niche is a runtime system that separates application's functional code from its non-functional (self-\*) code. An application in the framework consists of a component-based implementation of the applications functional specification (the lower part of 2.2), and a component-based implementation of the applications self-\* behaviors (the upper part). Niche provides functionality for component management and communication which is used by applications, in particular by user-written implementation of self-\* behaviors. Niche implements a run-time infrastructure that aggregates computing resources on the network used to host and execute application components.

A self-\* code in Niche framework is organized as a network of management elements (MEs) interacting through events. MEs are stateful entities that subscribe to and receive events from sensors, and other MEs.





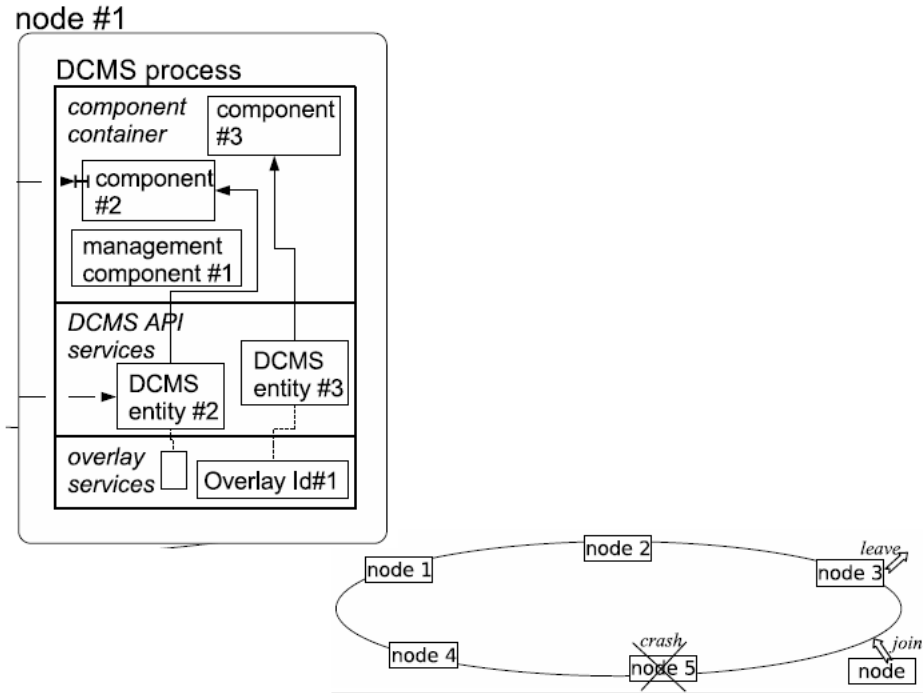


Figure 2.3: Niche container processes on Overlay network

the manager needs to know the current capacity, the desing capacity and the number of online users in order to meet a decision whether additional storage elements should be allocated, while the storage capacity aggregator knows only the current capacity of every storage element.

### 2.1.3 Niche Runtime Environment

The Niche runtime system consists of a set of distributed container processes, on several physical nodes, that can host components (MEs and application components). As shown in figure 2.3, the distributed containers are connected together through an overlay network. Niche relies on overlay network for scalable, self-\* address lookup and message delivery services. It also uses overlay to implement bindings between components, message passing between MEs, storage of architecture representation and failure sensing. On each physical node, there is a local Niche process that provides the Niche API to applications, as shown in figure 2.3 . The

overlay allows to locate entities stored on nodes of the overlay. On the overlay, entities are assigned unique overlay identifiers and for each overlay identifier, there is a physical node hosting the identified element. Such a node is usually referred as “responsible“ node for the identifier. Responsible nodes for overlay entities can change upon churn. Every physical node on the overlay and thus in Niche also has an overlay identifier, and can be located and contacted using that identifier.

Niche maintains several types of entities, in particular components of the application architecture and internal Niche entities maintaining representation of the application’s architecture. Niche entities are distributed on the overlay. Functional components are situated on the specified physical nodes, while MEs and entities representing the architecture might be moved upon churn between physical nodes.

## 2.2 Structured Overlay Networks

Structured Overlay Networks, SONs, are known for their self-organising features and resilience under churn[13]. We assume the following model of SONs and their APIs. We believe, this model is representative, and in particular it matches the Chord [14] SON. In the model, SON provides the operation to locate items on the network. For example, items can be data items for DHTs, or some compute facilities that are hosted on individual nodes in a SON. We say that the node hosting or providing access to an item is responsible for that item. Both items and nodes possess unique SON identifiers that are assigned from the same name space. The SON automatically and dynamically divides the responsibility between nodes such that there is always a responsible node for every SON identifier. SON provides a ‘lookup’ operation that returns the address of a node responsible for a given SON identifier. Because of churn, node responsibilities change over time and, thus, ‘lookup’ can return over time different nodes for the same item. In practical SONs the ‘lookup’ operation can also occasionally return wrong (inconsistent) results. Further more, SON can notify application software running on a node when the responsibility range of the node changes. When responsibility changes, items need to be moved between nodes accordingly. In Chord-like SONs the identifier space is circular, and nodes are responsible for items with identifiers in the range between the node’s identifier and the identifier

of the predecessor node. Finally, a SON with a circular identifier space naturally provides for symmetric replication of items on the SON - where replica IDs are placed symmetrically around the identifier space circle.

Symmetric Replication [15] is a scheme used to determine replica placement in SONs. Given an item ID  $i$  and a replication degree  $f$ , symmetric replication is used to calculate the IDs of the item's replicas. The ID of the  $x$ -th ( $1 \leq x \leq f$ ) replica of the item  $i$  is computed as follows:

$$r(i, x) = (i + (x - 1)N/f) \bmod N \quad (2.1)$$

where  $N$  is the size of the identifier space.

The IDs of replicas are independent from the nodes present in the system. A *lookup* is used to find the node responsible for hosting an ID. For the symmetry requirement to always be true, it is required that the replication factor  $f$  divides the size of the identifier space  $N$ .

## 2.3 Paxos

Paxos [9] is a well known consensus protocol for dynamic distributed environments. Consensus can be either about agreeing on a set of values to commit or to make a course of actions or decisions. Paxos, as standalone protocol is easy to understand, but in real-life scenarios, a variant of the original protocol is usually used.

### 2.3.1 Basic Protocol

Paxos describes the actions of the process, involved in the consensus phase, by their roles in the protocol. These are Client, Acceptor, Proposer, Learner and Leader. Each process or node can play multiple of these roles at the same time.

- **Client:** The Client issues a request to the proposer and waits for the response.
- **Acceptor:** Used to choose a single value
- **Proposer:** On client request, propose a value to be chosen by Acceptors.

- **Learner:** Learn what value has been chosen.
- **Leader:** Paxos requires a distinguished Proposer (called the leader) to make progress.

In this paper, every process or node in the system is assumed to be playing the role of Acceptor, Proposer and Learner at the same time. For the sake of simplicity, let us assume that one of the processes has been chosen as the leader and only leader can propose.

There are two phases of the Paxos protocol, as describes by Leslie Lamport [9] and that works as below:

- Phase 1 (Prepare Phase)**
1. A proposer selects a proposal number  $n$  and sends a prepare request with number  $n$  to a majority of acceptors.
  2. If an acceptor receives a prepare request with number  $n$  greater than that of any prepare request to which it has already responded, then it responds to the request with a promise not to accept any more proposals numbered less than  $n$  and with the highest-numbered proposal (if any) that it has accepted.
- Phase 2 (Propose Phase)**
1. If the proposer receives a response to its prepare requests (numbered  $n$ ) from a majority of acceptors, then it sends an accept request to each of those acceptors for a proposal numbered  $n$  with a value  $v$ , where  $v$  is the value of the highest-numbered proposal among the responses, or is any value if the responses reported no proposals.
  2. a) If an acceptor receives an accept request for a proposal numbered  $n$ , it accepts the proposal unless it has already responded to a prepare request having a number greater than  $n$ .

Paxos fulfils Safety property at all time while liveness requirement asserts that if there are enough non-faulty process are available for a long enough time, then some value is eventually chosen [16].

### 2.3.2 3-PHASE PAXOS

There is a variant of basic paxos that reduces the total number of messages being sent in phase 2 of the protocol. In phase 2, all the processes, rather

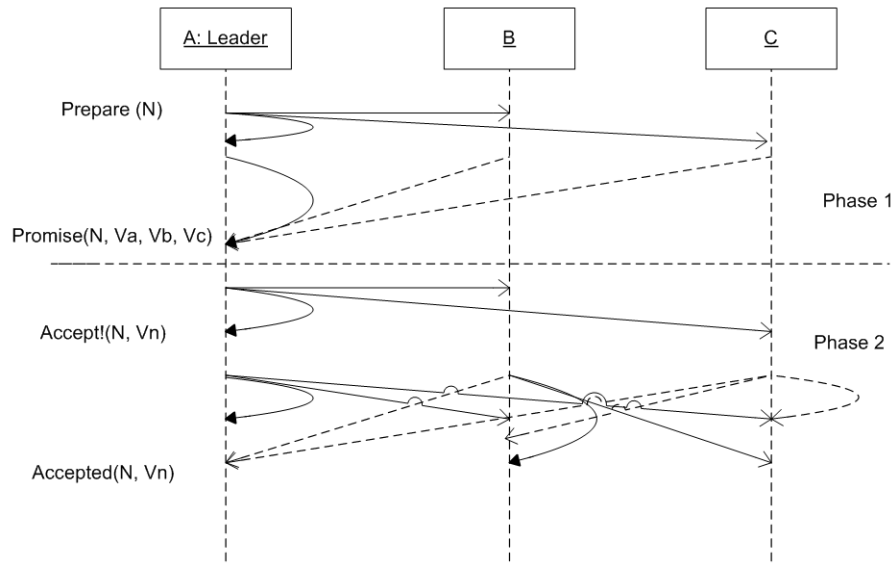


Figure 2.4: Basic Paxos 2-Phase Protocol

than sending the messages to every other process, sends the message only to the leader. When leader will receives  $2b$  messages from quorum, it will start phase 3 of the Paxos protocol and inform other processes about the decision by sending the DECIDE message. This type of Paxos protocol has fewer number of messages at the cost of two one more message delay.

### 2.3.3 Multi-Paxos Optimization

In a replicated state machine scenario, a Paxos consensus is required for every action to be taken by each replicated state machine. As described above, every consensus has an overhead of at least four message delays. If a complete Paxos instances will be executed for every action that is to be taken by each replica, it will be a significant amount of overhead on the system.

If the leader is relatively stable, phase-1 can be skipped for future instances of the protocol with the same leader [17]. When a process becomes a leader, it executes phase-I to get the latest state and to get the promise for all the future consensus instances until a new leader is selected. In this way, phase-1 will be executed only once and every time, when the leader receives a request from the client, it only executes the rest of the protocol as shown below.

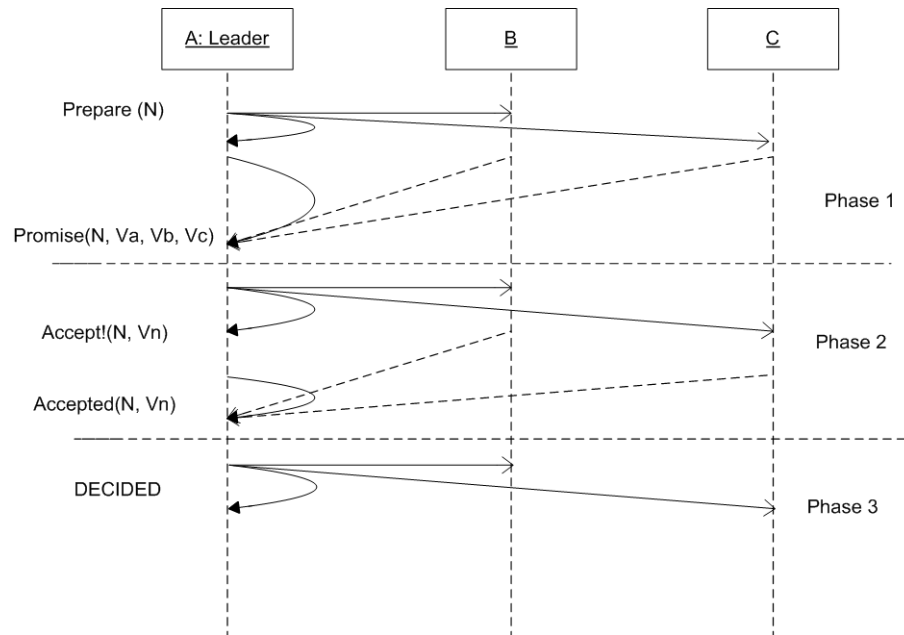


Figure 2.5: Basic Paxos 3-Phase Protocol

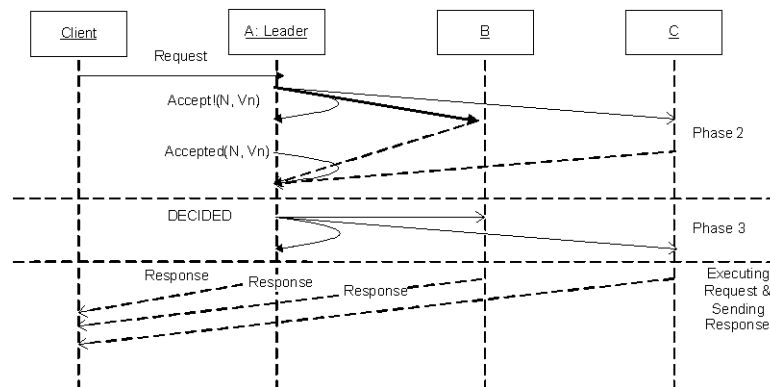


Figure 2.6: 3-Phase Paxos Protocol with stable leader

## 2.4 Replicated Stateful Services

### 2.4.1 System Model

State machine replication [9, 18, 19] approach is a renowned method for implementing fault-tolerant and consistent distributed services. In this approach, a copy of the service a.k.a. replica, runs on each machine. These replicas communicate by passing messages in a communication

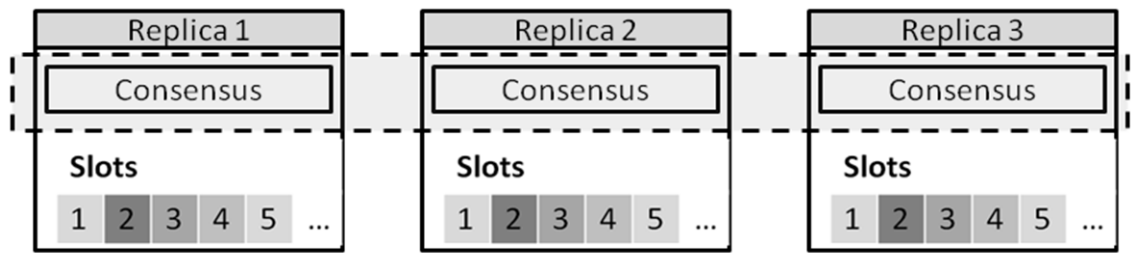


Figure 2.7: Virtual Slots in Replicated State Machine

network. Communication is asynchronous and unreliable where messages can be duplicated, lost or can take an arbitrarily long time to arrive. But messages which arrive on the destination machines are not corrupted.

These replicas should be deterministic and their states should only depend upon the previous states and their inputs. They all begin in the same initial state. A replica moves from one state to the next by applying/executing an update/request to its state machine. The next state is completely being determined by the current state and the update being executed.

Clients send/request updates to the replicas. Each update is distinguished by the identifier of the sender client and a client-based monotonically increasing sequence number. The State Machine Replication by Paxos for System Builders assumes that each client has at most one outstanding update at one time.

Replicas use PAXOS protocol to globally order all the clients requests and execute these requests in the same order. So, every replica should have the same state after executing the same number of requests.

### 2.4.2 Maintaining Global Order Using Virtual Slots

To globally order all client requests, every replica has maintained in itself a list of virtual slots and assigns each clients update/request to one of these slots. These slots are numbered incrementally and the assigned requests will be executed in the same order e.g. If request X is assigned to slot 50 and request Y is assigned to slot 51, then first X will be executed and then Y. To assign requests to a slot, one of the replicas becomes the leader using some leader election algorithm.



### 2.4.3 Request Handling Using PAXOS

A simple sequence of handling of client's request can be explained as follows: the client sends a request to the replica group. All replicas, on receiving this request, will store this message into their pending list. When the leader replica receives the client request, it will choose the next available virtual slot and will send the proposal to other replicas. This proposal will be a tentative suggestion that the given client's request should occupy the proposed slot. Each replica, on receiving this proposal, will log it (write it to some stable storage) and then sends the leader a confirmation message. On receiving the confirmation message from the quorum, the leader announces that the proposal has been decided by sending the DECIDE message to all the replicas. Each replica, receiving the DECIDE message will set the status of the request slot to **ready to be executed**. Once all requests with lower slot numbers are executed, the replicas will execute the request and send the reply to the client. The client will receive multiple confirmations for the give request, but will just ignore the additional confirmations for the same request.

### 2.4.4 Leader Replica Failure

Replicated state machines are using multi-paxos protocol, in which the phase-1 (Prepare phase) is only executed once the leader changes. When a leader fails, other replicas select a new leader using a leader election algorithm. The newly elected leader will run the Prepare phase for all future instances of the Paxos protocol (i.e. for all sequence numbers) that will run until the leader is changed again.

The leader replica will send PREPARE message to start the prepare phase. The prepare message will contain the last slot number the sender has executed update till. In the group with newly elected leader, the leader will make the proposal above that slot number. So this message is to learn about any accepted proposals for the next slots.

Upon receiving the PREPARE message, a replica will send back a promise message that contains information about each slot after the last leader given slot. For each slot, the replica will send the LOGGED proposals and DECISIONS (if any).

Leader, on receiving the promise messages from quorum, will first update its status from the DECISIONS and will propose messages that it got as

part of the Promise messages. After that, leader will be ready to propose new messages.

### 2.4.5 Flow Control

As suggested by Lamport [9], to avoid having too much undecided proposals at one time, our implementation also has a sliding window mechanism for proposing requests. The size of this sliding window is usually referred to as  $a$ . So, the leader can propose updates from  $i$  to  $i+a$  after updates 1 through  $i$  are decided.

## 2.5 Leader Election and Stability without Eventual Timely Links

In a replicated state machine, the leader replica can fail. So, each replica uses a HEARTBEAT mechanism to learn if the other replica is still alive. If the leader fails, other replicas will start a protocol to choose the new leader. In this section, we will discuss about two of the most well known leader election algorithms in distributed dynamic environment.

Let us define two important properties of a coordination protocol like Paxos in a distributed system.

### Safety

- Non-triviality: No value is chosen unless it is first proposed.
- Consistency: No two distinct values are both chosen. (two different learners cannot learn different values).

### Liveness

- Termination: We'd like the protocol to eventually terminate.

Paxos safety property must be preserved at all times while its liveness property depends on the selection of a single leader.

### 2.5.1 Eventual Leader Election ( $\Omega$ )

Eventual Leader Election ( $\Omega$ ) abstraction encapsulates a leader election algorithm which ensures that eventually the correct processes will elect the same/single correct process as their leader [20]. It has the following properties.

- **Eventual Accuracy:** There is a time after which every correct process trusts some correct process.
- **Eventual Agreement:** There is a time after which no two correct processes trust different correct processes.

While  $\Omega$  captures the abstract properties needed to provide liveness, it does not provide much concrete information about system conditions under which progress can be guaranteed. So we use leader election as described in

### 2.5.2 $\Omega$ with $\diamond f$ -Accessibility

$\Omega$  has been described with more precise requirements in paper “ $\Omega$  Meets Paxos: Leader Election and Stability without Eventual Timely Links“ [21]. It requires  $\diamond f$ -Accessibility for this protocol to work, which is defined by this paper as follows:

**Timely Link** : A link between two processes is timely at time  $t$  if the sender receives the response within  $d$  time.

**f-accessibility** : A process  $p$  is said to be  $f$ -accessible at time  $t$  if there exist  $f$  other processes  $q$  such that the link between  $p$  and  $q$  are timely at  $t$ .

**$\diamond f$ -accessibility** : There is a time  $t$  and a process  $p$  such that for all  $t' \geq t$ ,  $p$  is  $f$ -accessible at  $t'$ .

In this paper, from now on, we will refer to this algorithm as  $\diamond f$ -Accessible Leader Election .

There are two major contributions that are made by this algorithm:

- $\diamond f$ -Accessible Leader Election [21] algorithm formulates more precisely the synchrony conditions required to achieve leader election. It guarantees to elect a leader without having eventual timely links. Progress is guaranteed in the following surprisingly weak settings: Eventually one process can send messages such that every message obtains  $f$  timely responses, where  $f$  is a resilience bound. Such a process is named as  $\diamond f$ -accessible. These  $f$  responders need not be fixed and may change from one message to another. This condition is very much according to the workings of Paxos, whose safety does not necessitate that the  $f$  processes with which a leader interacts be fixed [21].
- The second contribution provided by this algorithm [21] is leader stability. In Paxos, change of leader is a costly operation as it necessitates the execution of a prepare phase by the new leader. This improvement suggests that a qualified leader (a leader which remains capable of having proposals committed in a timely fashion) should not be demoted.

In our model for replication of management elements, we have implemented  $\diamond F$ -Accessible leader election without the optimization of leader stability. The optimization for leader stability will be implemented in future.

### 2.5.3 Protocol Specification

In this protocol [21], every process maintains for itself a state that comprises of a non-decreasing epochNum and an epoch freshness counter. An epochNum is a pair of serialNum and processId that can be null as well. States are ordered lexicographically i.e. First by epochNum and then by processId (epochNum is internally ordered first by serialNum and then by processId. In addition to that each process maintains a copy of registry, which is a collection of states of all processes in the group. A process updates the state of another process when it handles REFRESH message from that process.

There are three timers that are being used in this algorithm. These are refreshTimer with length  $\Delta$  time units, roundtripTimer with  $\delta$  time unit and readTimer with  $(\Delta + \delta)$  time units. On expiration of refreshTimer each process will send a refresh message containing its state to all other

processes and will start the `roundtripTimer` with  $d$  time units timeout. When a process receives this request, it updates the sender process state in its own replica of registry and sends response with a `refreshack` message. If the process is able to receive the `refreshack` messages from  $f+1$  processes before `roundtripTimer` expires, the process will be sure that it has timely links with at least  $f+1$  processes and hence it will increment its freshness count in its registry. On the other hand, if a process is not able to receive `refreshack` messages from  $f+1$  processes, it will increase its `serialNum` in its epoch inside the registry.

In addition to registry, every process also records the states of all other processes in a vector named `views`. The `views` vector also contains an expiry bit for every process in addition to that process state. The expiry bit is to indicate whether that process state has been continuously refreshed or not. To assess whether a process state (epoch number) has expired, every process updates its view by periodically reading the entire registry vector from  $n-f$  processes. We have taken  $n$  as the total number of processes and  $f$  as  $n/2$ . The full specification of the algorithm can be read from the original paper [21].

## 2.6 Migration of Replicated Stateful Services

SMART [8] is a technique for changing the set of nodes where a replicated state machine runs, i.e. migrate the service. The fixed set of nodes, where a replicated state machine runs, is called a *configuration*. Adding and/or removing nodes (replicas) in a configuration will result in a new configuration.

SMART is built on the migration technique outlined in [22]. The idea is to have the current configuration as a part of the service state. The migration to a new configuration proceeds by executing a special request that causes the current configuration to change. This request is like any other request that can modify the state. The change does not happen immediately but is scheduled to take effect after  $\alpha$  slots. This gives the leader the flexibility to safely propose requests to  $\alpha$  slots concurrently, without worrying about configuration change. This technique of proposing multiple concurrent requests is also known as pipelining.

The main advantage of SMART over other migration technique is that it allows to replace non-failed nodes. This enables SMART to rely on an automated service (that may use imperfect failure detector) to maintain the configuration by adding new nodes and removing suspected ones.

An important feature of SMART is the use of configuration-specific replicas. The service migrates from `conf1` to `conf2` by creating a new independent set of replicas in `conf2` that run in parallel with replicas in `conf1`. The replicas in `conf1` are kept long enough to ensure that `conf2` is established. This simplifies the migration process and help SMART to overcome problems and limitations of other techniques. This approach can possibly result in many replicas from different configurations to run on the same node. To improve performance, SMART uses a shared execution module that holds the state and which is shared among replicas on the same node. The execution module is responsible for modifying the state by executing assigned requests sequentially and producing output. Other than that each configuration runs its own instance of the Paxos and leader election algorithm independently without any sharing. This makes it, from the point of view of the replicated state machine instance, look like as if the Paxos algorithm is running on a static configuration. Conflicts between configurations are avoided by assigning a non-overlapping range of slots  $[\text{FirstSlot}, \text{LastSlot}]$  to each configuration. The `FirstSlot` for `conf1` is set to 1. When a configuration change request appears at slot  $n$  this will result in setting `LastSlot` of current configuration to  $n + \alpha - 1$  and setting the `FirstSlot` of the next configuration to  $n + \alpha$ .

Before a new replica in a new configuration can start working it must acquire a state from another replica that is at least `FirstSlot-1`. This can be achieved by copying the state from a replica from the previous configuration that has executed `LastSlot` or from a replica from the current configuration. The replicas from the previous configuration are kept until a majority of the new configuration have initialised their state.

## 2.7 KOMPICS

Kompics [23] is a reactive component model that is used for programming, configuring and executing distributed protocols as software components that interact asynchronously using data-carrying events [24, 25, 26]. Kompics is similar to Fractal component model which is a modular,

extensible and programming language agnostic component model that can be used to design, implement, deploy and reconfigure systems and applications, from operating systems to middleware platforms and to graphical user interfaces [11]. As DCMS has been derived from Fractal Component Model [11], so to mimic the fractal programming model and to ease the development, we have used Kompics [25] framework to implement our prototype.

Kompics components are reactive, concurrent and they can be composed into complexed architecture of composite components. These components are safely configurable at runtime and allow for sharing of common subcomponents at various levels in the component hierarchy [26]. Components communicate by passing data-carrying events through typed bidirectional ports connected by channels. Ports are event-based component interfaces and they represent a service or protocol abstraction. There are two directions of port i.e. + and -. A + event will go to + side of the port and - event will go to - side. A component either provides + or requires - as port [23].

Kompics has developed a set of utility components and methodology for building and evaluating P2P systems. The framework provides many reusable components e.g. bootstrap service, failure detectors, network and timers. Kompics has developed and evaluated a Chord overlay to demonstrate the practicality of Kompics framework.

### 2.7.1 Chord Overlay Using Kompics

Kompics has developed and evaluated a Chord overlay to demonstrate the practicality of Kompics P2P framework [23]. It also has provided a simulation environment where the whole Chord overlay system can be executed. The Chord simulation architecture is as shown in figure 2.8.

The simulation environment is a single process running all the peers, bootstrap and monitor server within the same process. ChordSimulationMain is executed using a single-thread simulator scheduler for deterministic replay and simulated time advancement. P2pOrchestrator is a generic component that interprets experiment scenarios and sends the scenario events e.g. chordJoin, chordLookup to the ChordSimulator. P2pOrchestrator also provides a network abstraction and can be configured with a specific latency and bandwidth model.

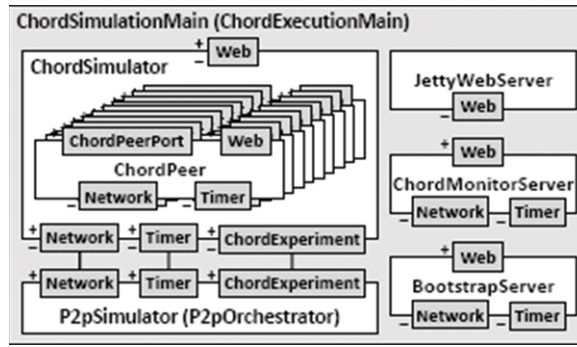


Figure 2.8: Kompics simulation architecture [23]

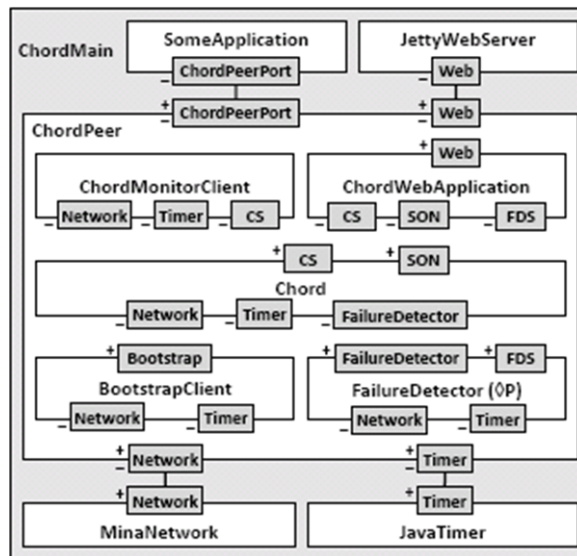


Figure 2.9: Architecture of Chord Implementation as developed by Kompics [23]

P2pSimulator and P2pOrchestrator can be replaced with each other, but P2pOrchestrator simulate everything in real time. It uses KingLatencyMap[12] to simulate a real-life overlay network. The detail of KingLatencyMap will be discussed in section “Real-Time Network Simulation“.

ChordSimulator in Kompics simulation environment consist of all ChordPeers in the overlay. A ChordPeer simulate a node abstraction in Chord overlay. A detail architecture of ChordPeer is shown in figure 2.9

ChordPeerPort is used to pass all events to ChordPeer including ChordLookup and ChordJoin. The Network and Timer abstractions are



provided by the MinaNetwork [27] and JavaTimer component. The ChordMonitorClient periodically check the Chord status and send it to the ChordMonitorServer, as shown in figure 7.1. For detail about working of the Chord, please refer to Building and Evaluating P2P Systems using the Kompics Component Framework [23]

### 2.7.2 REAL-TIME NETWORK SIMULATION

In Kompics, as described above, P2pOrchestrator provides a real-time network abstraction for applications working in wide area networks. To provide such an abstraction, P2pOrchestrator uses KingLatencyMap [28]. KingLatencyMap is used to estimate latency between any two Internet hosts, from any other Internet host. The accuracy of this estimation can be further verified from King: Estimating Latency between Arbitrary Internet End Hosts [28].



## Chapter 3

# Proposed Solution for Robust Management Elements

In this section we present our approach and associated algorithm to achieve robust services. Our algorithm automates the process of selecting a replica set (configuration) and the decision of migrating to a new configuration in order to tolerate resource churn. This approach, which includes our algorithm combined with the replicated state machine technique and migration support, will provide a robust service that can tolerate continuous resource churn and run for long period of time without the need of human intervention.

Our approach was mainly designed to provide Robust Management Elements (RMEs) abstraction that is used to achieve robust self-management. An example is our platform Niche [3, 4] where this technique is applied directly and RMEs are used to build robust autonomic managers. However, we believe that our approach is generic enough and can be used to achieve other robust services. In particular, we believe that our approach is suitable for structured P2P applications that require highly available robust services.

We assume that the environment that will host the Replicated State Machines (RSMs) consists of a number of nodes (resources) that form together a Structured Overlay Network (SON). The SON may host multiple RSMs. Each RSM is identified by a constant ID drawn from the SON identifier space, which we denote as RSMID in the following. RSMID permanently identifies an RSMs regardless of the number of nodes in the system and node churn that causes reconfiguration of set of replicas in an

RSM. Given an RSMID and the replication degree, symmetric replication scheme is used to calculate the SON ID of each replica. The replica SON ID is used to assign a responsible node to host each replica in a similar way as in Distributed Hash Tables (DHTs). This responsibility, unlike the replica ID, is not fixed and changes overtime because of node churn. Clients that send requests to RSM need to know only its RSMID and replication degree. With this information clients can calculate identities of individual replicas according to the symmetric replication scheme, and locate the nodes currently responsible for the replicas using the lookup operation provided by the SON. Most of the nodes found in this way will indeed host up-to-date RSM replicas - but not necessarily all of them because of lookup inconsistency and node churn.

Fault-tolerant consensus algorithms like Paxos require a fixed set of known replicas that we call configuration. Some of replicas, though, can be temporarily unreachable or down (the crash-recovery model). The SMART protocol extends the Paxos algorithm to enable explicit reconfiguration of replica sets. Note that RSMIDs cannot be used for neither of the algorithms because the lookup operation can return over time different sets of nodes. In the algorithm we contribute for management of replica sets, individual RSM replicas are mutually identified by their addresses which in particular do not change under churn. Every single replica in a RSM configuration knows addresses of all other replicas in the RSM.

The RSM, its clients and the replica set management algorithm work roughly as follows. A dedicated initiator chooses RSMID, performs lookups of nodes responsible for individual replicas and sends to them a request to create RSM replicas. Note the request contains RSMID, replication degree, and the configuration consisting of all replica addresses, thus newly created replicas perceive each other as a group and can communicate with each other directly without relying on the SON. RSMID is also distributed to future RSM clients.

Because of churn, the set of nodes responsible for individual RSM replicas changes over time. In response, our distributed configuration management algorithm creates new replicas on nodes that become responsible for RSM replicas, and eventually deletes unused ones. The algorithm consists of two main parts. The first part runs on all nodes of the overlay and is responsible for monitoring and detecting changes in the replica set caused by churn. This part uses several sources of events and

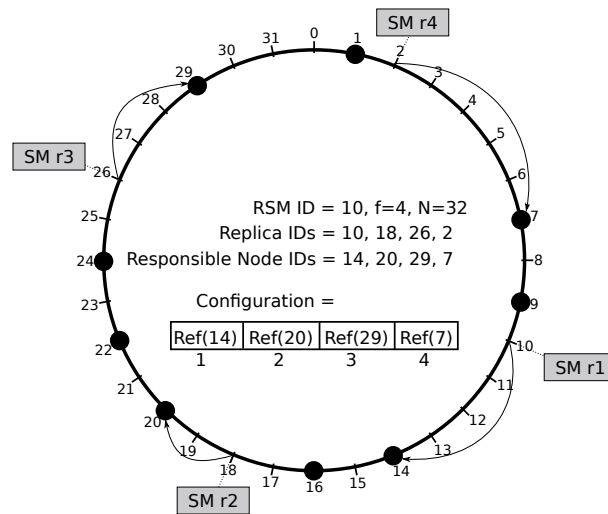


Figure 3.1: Replica Placement Example: Replicas are selected according to the symmetric replication scheme. A Replica is hosted (executed) by the node responsible for its ID (shown by the arrows). A configuration is a fixed set of direct references (IP address and port) to nodes that hosted the replicas at the time of configuration creation. The RSM ID and Replica IDs are fixed and do not change for the entire life time of the service. The Hosted Node IDs and Configuration are only fixed for a single configuration. Black circles represent physical nodes in the system.

information, including SON node failure notifications, SON notifications about change of responsibility, and requests from clients that indicates the absence of a replica. Changes in the replica set (e.g. failure of a node that hosted a replica) will result in a configuration change request that is sent to the corresponding RSM. The second part is a special module, called the management module, that is dedicated to receive and process monitoring information (the configuration change requests). The module use this information to construct a configuration and also to decide when it is time to migrate (after a predefined amount of changes in the configuration). We discuss the algorithm in greater detail in the following.

### 3.1 Configurations and Replica Placement Schemes

All nodes in the system are part of SON as shown in Fig. 3.1. The Replicated State Machine that represents the service is assigned an *RSMID* from

## Algorithm 1: Helper Procedures

```

1: procedure GETCONF(RSMID)
2:   ids[]  $\leftarrow$  GETREPLICAIDS(RSMID) ▷ Replica Item IDs
3:   for  $i \leftarrow 1, f$  do refs[ $i$ ]  $\leftarrow$  LOOKUP(ids[ $i$ ])
4:   end for
5:   return refs[]
6: end procedure

7: procedure GETREPLICAIDS(RSMID)
8:   for  $x \leftarrow 1, f$  do ids[ $x$ ]  $\leftarrow$   $\mathbf{r}(\mathbf{RSMID}, x)$  ▷ See equation 2.1
9:   end for
10:  return ids[]
11: end procedure

```

the SON identifier space of size  $N$ . The set of nodes that will form a configuration are selected using the symmetric replication technique [15]. The symmetric replication, given the replication factor  $f$  and the *RSMID*, is used to calculate the *Replica IDs* according to equation 2.1. Using the `lookup()` operation, provided by the SON, we can obtain the IDs and direct references (IP address and port) of the responsible nodes. These operations are shown in Algorithm 1. The rank of a replica is the parameter  $x$  in equation 2.1. A configuration is represented by an array of size  $f$ . The array holds direct *references* (IP and port) to the nodes that form the configuration. The array is indexed from 1 to  $f$  and each element contains the reference to the replica with the corresponding rank.

The use of direct references, instead of using lookup operations, as the configuration is important for our approach to work for two reasons. First reason is that we can not rely on the lookup operation because of the lookup inconsistency problem. The lookup operation, used to find the node responsible for an ID, may return incorrect references. These incorrect references will have the same effect in the replicatino algorithm as node failures even though the nodes might be alive. Thus the incorrect references will reduce the fault tolerance of the replication service. Second reason is that the migration algorithm requires that both the new and the previous configurations coexist until the new configuration is established. Relying on lookup operation for `replica.IDs` may not be possible. For example, in Figure 3.1, when a node with  $ID = 5$  joins the overlay it becomes responsible for the replica `SM_r4` with  $ID = 2$ . A correct `lookup(2)` will always return 5. Because of this, the node 7, from the previous configuration, will never be reached using the lookup operation. This can also reduce the fault tolerance of the service and prevent the migration in the case of large number of joins.

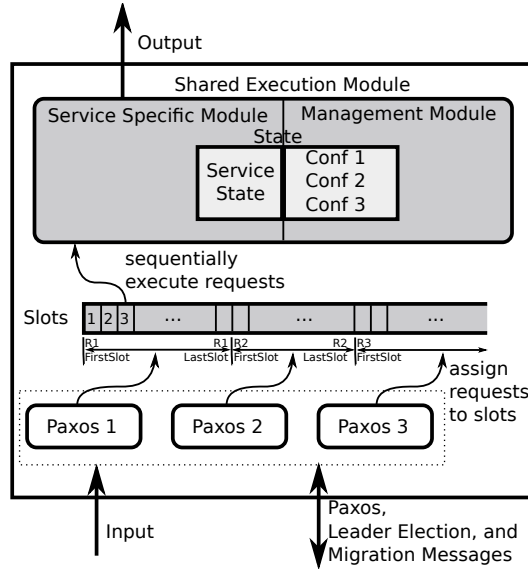


Figure 3.2: State Machine Architecture: Each machine can participate in more than one configuration. A new replica instance is assigned to each configuration. Each configuration is responsible for assigning requests to a none overlapping range of slot. The execution module executes requests sequentially that can change the state and/or produce output.

Nodes in the system may join, leave, or fail at any time (churn). According to the Paxos constraints, a configuration can survive the failure of less than half of the nodes in the configuration. In other words,  $f/2 + 1$  nodes must be alive for the algorithm to work. This must hold independently for each configuration. New configuration, on receiving JOIN messages will reply with READY messages. Once a configuration receives READY messages from more than half the replicas in new configuration, it considers the new configuration as established and can destroy itself. The detail of this process is explained in SMART [8].

Due to churn, the responsible node for a certain replica may change. For example in Fig.3.1 if node 20 fails then node 22 will become responsible for identifier 18 and should host `SM_r2`. Our algorithm, described in the remainder of this section, will automate migration process by detecting the change and triggering a `ConfChange` requests when churn changes responsibilities. The `ConfChange` requests will be handled by the state machine and will eventually cause it to migrate to a new configuration.

## 3.2 State Machine Architecture

The replicated state machine (RSM) consists of a set of replicas, which forms a configuration. Migration techniques can be used to change the configuration (the replica set). The architecture of a replica is shown in Fig. 3.2. The architecture uses the shared execution module optimization presented in [8]. This optimization is useful when the same replica participate in multiple configurations. The execution module executes requests. The execution of a request may result in state change, producing output, or both. The execution module should be a deterministic program. Its outputs and states must depend only on the sequence of input and the initial state. The execution module is also required to support checkpointing. That is the state can be externally saved and restored. This enables us to transfer states between replicas.

The execution module is divided into two parts: the service specific module and the management module. The service specific module captures the logic of the service and executes all requests except the `ConfChange` request which is handled by the management module. The management module maintains a *next configuration* array that it uses to store `ConfChange` requests in the element with the corresponding rank. After a predefined threshold of the number and type (join/leave/failure) of changes. The management module decides that it is time to migrate. It uses the next configuration array to update the current configuration array resulting in a new configuration. After that the management module passes the new configuration to the migration protocol to actually preform the migration. The reason to split the state in two parts is because the management module is generic and independent of the service and can be reused with different services. This simplifies the development of the service specific module and makes it independent from the replication technique. In this way legacy services, that are already developed, can be replicated without modification given that they satisfy execution module constraints (determinism and checkpointing).

In a corresponding way, the state of a replica consists of two parts: The first part is internal state of the service specific module which is application specific; The second part consists of the configurations.

The remaining parts of the replica, other than the execution module, are responsible to run the replicated state machine algorithms (Paxos and Leader Election) and the migration algorithm (SMART). As described in



the previous section, each configuration is assigned a separate instance of the replicated state machine algorithms. The migration algorithm is responsible for specifying the `FirstSlot` and `LastSlot` for each configuration, starting new configurations, and destroying old configurations after the new configuration is established.

The Paxos algorithm guarantees liveness when a single node acts as a leader, thus it relies on a fault-tolerant leader election algorithm. Our system uses the algorithm described in[21]. This algorithm guarantees progress as long as one of the participating processes can send messages such that every message obtains  $f$  timely (i.e. with a pre-defined timeout) responses, where  $f$  is a algorithm's constant parameter specifying how many processes are allowed to fail. Note that the  $f$  responders may change from one algorithm round to another. This is exactly the same condition on the underlying network that a leader in the Paxos itself relies on for reaching timely consensus. Furthermore, the aforementioned work proposes an extension of the protocol aiming to improve leader stability so that qualified leaders are not arbitrarily demoted which causes significant performance penalty for the Paxos protocol.

### 3.3 Replicated State Machine Maintenance

This section will describe the algorithms used to create a replicated state machine and to automate the migration process in order to survive resource churn.

#### 3.3.1 State Machine Creation

A new RSM can be created by any node in the SON by calling `CreateRSM` shown in Algorithm 2. The creating node construct the configuration using symmetric replication and lookup operations. The node then sends an `InitSM` message to all nodes in the configuration. Any node that receives an `Init SM` message (Algorithm 6) will start a state machine (SM) regardless of its responsibility. Note that the initial configuration, due to lookup inconsistency, may contain some incorrect nodes. This does not cause problems for the replication algorithm. Using migration, the configuration will eventually be corrected.

## Algorithm 2: Replicated State Machine API

```

1: procedure CREATERSM(RSMID)
    ▷ Creates a new replicated state machine
2:   Conf[] ← GETCONF(RSMID)
    ▷ Hosting Node REFs
3:   for i ← 1, f do
4:     sendto Conf[i] : INITSM(RSMID, i, Conf)
5:   end for
6: end procedure

7: procedure JOINRSM(RSMID, rank)
8:   SUBMITREQ(RSMID, ConfChange(rank, MyRef))
    ▷ The new configuration will be submitted and assigned a slot to be executed
9: end procedure

10: procedure SUBMITREQ(RSMID, req)
    ▷ Used by clients to submit requests
11:   Conf[] ← GETCONF(RSMID)
    ▷ Conf is from the view of the requesting node
12:   for i ← 1, f do
13:     sendto Conf[i] : SUBMIT(RSMID, i, Req)
14:   end for
15: end procedure

```

### 3.3.2 Client Interactions

A client can be any node in the system that requires the service provided by the RSM. The client need only to know the *RSMID* and the replication degree to be able to send requests to the service. Knowing the *RSMID*, the client can calculate the current configuration using equation 2.1 and lookup operations (See Algorithm 1). This way we avoid the need for an external configuration repository that points to nodes hosting the replicas in the current configuration. The client submits requests by calling `SubmitReq` as shown in Algorithm 2. The method simply sends the request to all replicas in the current configuration. Due to lookup inconsistency, that can happen either at the client side or the *RSM* side, the client's view of the configuration and the actual configuration may differ. We assume that the client's view overlaps, at least at one node, with the actual configuration for the client to be able to submit requests. Otherwise, the request will fail and the client need to try again later after the system heals itself. We also assume that each request is uniquely stamped and that duplicate requests are filtered. In the current algorithm the client submits the request to all nodes in the configuration for efficiency. It is possible to optimise the number of messages by submitting the request only to one node in the configuration that will forward it to the current leader. The trade off is that sending to all nodes increases the probability of the request reaching

## Algorithm 3: Execution

```

1: receipt of SUBMIT(RSMID, rank, Req) from m at n
2:   SM  $\leftarrow$  SMs[RSMID][rank]
3:   if SM  $\neq$   $\phi$  then
4:     if SM.leader = n then SM.schedule(Req) ▷ Paxos schedule it
5:     else ▷ forward the request to the leader
6:       sendto SM.leader : SUBMIT(RSMID, rank, Req)
7:     end if
8:   else
9:     if  $r(\text{RSMID}, \text{rank}) \in ]n.\text{predecessor}, n]$  then ▷ I'm responsible
10:      JOINRSM(RSMID, rank) ▷ Fix the configuration
11:    else
12:      DONOTHING ▷ This is probably due to lookup inconsistency
13:    end if
14:  end if
15: end receipt

16: procedure EXECUTESLOT(req) ▷ The Execution Module
17:   if req.type = ConfChange then ▷ The Management Module
18:     nextConf[req.rank]  $\leftarrow$  req.id
19:     ▷ Update the candidate for the next configuration
20:     if nextConf.changes = threshold then
21:       newConf  $\leftarrow$  UPDATE(CurrentConf, NextConf)
22:       SM.migrate(newConf)
23:       ▷ SMART will set LastSlot and start new configuration
24:     end if
25:   else ▷ The Service Specific Module handles all other requests
26:     ServiceSpecificModule.Execute(req)
27:   end if
28: end procedure

```

the *RSM*. This reduces the negative effects of lookup inconsistencies and churn on the availability of the service. Clients may also cache the reference to the current leader and use it directly until the leader changes.

### 3.3.3 Handling Lost Messages

We have assumed a fair-loss model of message delivery. That means, some messages can be lost even when sending them to alive replicas. To increase the probability of handling every message sent by the clients every client submits the requests to each replica in a RSM. Each non-leader replica will forward the message to the leader replica, which will ignore duplicate messages. This approach might result in overloading leader with too many messages, especially when the degree of replication is large. To avoid this situation, there is another mechanism that has been tested. Each received message should be tagged with the received timestamp and should be stored by each replica in a pending requests queue. Periodically, every replica checks the pending requests queue and if a request has been in the pending

## Algorithm 4: Lost Message Handling

```

1: receipt of SUBMIT(RSMID, rank, Req) from m at n
2:   SM ← SMs[RSMID][rank]
3:   if SM ≠  $\phi$  then
4:     if SM.leader = n then SM.schedule(Req)           ▷ Paxos schedule it
5:     else                                           ▷ tag and save request in pending list
6:
7:       Req.rcvds ← currts                               ▷ tag recieved Request
8:       store pendingReqs : STORE(RSMID, Req)
9:     end if
10:  else
11:    if  $r(\text{RSMID}, \text{rank}) \in ]n.\text{predecessor}, n]$  then           ▷ I'm responsible
12:      JOINRSM(RSMID, rank)                                   ▷ Fix the configuration
13:    else
14:      DONTHING                                           ▷ This is probably due to lookup inconsistency
15:    end if
16:  end if
17: end receipt

18: procedure CHECKEXPIREDREQUEST(RSMID, rank)           ▷
19:   SM ← SMs[RSMID]
20:   for i ← 1, sizeof(SM.pendingReqs) do           ▷ check every request in pending list
21:     if (currts − SM.PendingReqs[req].rcvds) > threshold then
22:
23:       SM.PendingReqs[req].rcvds ← currts           ▷ reset timestamp
24:       sendto SM.leader : SUBMIT(RSMID, rank, SM.PendingReqs[req]) ▷ forward
the request to the leader
25:     end if
26:   end for
27: end procedure

28: procedure DECIDESLOT(RSMID, req)           ▷ The Execution Module
29:   SM ← SMs[RSMID]
30:   SM.PendingReqs[req].remove()           ▷ Remove request from pending list
31:   ExecuteSlot(req)
32: end procedure

```

list for a long time, it is retransmitted to the leader. Algorithm 3 `Submit` method can be modified as shown in Algorithm 4. Once the request is decided, it is removed from the pending list.

### 3.3.4 Request Execution

The execution of client requests is initiated by receiving a submit request from a client and consists of three phases. Checking if the node is responsible for the request, scheduling the request and then execute it.

When a node receives a request from a client it will first check, using the RSMID in the request, if it is hosting the replica to which the request is directed to. If this is the case, then the node will submit the request to that replica. The replica will try to schedule the request for execution if the

## Algorithm 5: Churn Handling

```

1: procedure NODEJOIN ▷ Called by SON after the node joined the overlay
2:   sendto successor : PULLSMS( $\{predecessor, myId\}$ )
3: end procedure

4: procedure NODELEAVE
5:   sendto successor : NEWSMS(SMs) ▷ Transfer all hosted SMs to Successor
6: end procedure

7: procedure NODEFAILURE(newPred, oldPred) ▷ Called by SON when the predecessor fails
8:    $I \leftarrow \bigcup_{x=2}^f [r(newPred, x), r(oldPred, x)]$ 
9:   multicast  $I$  : PULLSMS( $I$ )
10: end procedure

```

replica believes that it is the leader. Otherwise the replica will forward the request to the leader.

On the other hand, if the node is not hosting a replica with the corresponding RSMID, it will proceed with one of the following two scenarios: In the first scenario, It may happen due to lookup inconsistency that the configuration calculated by the client contains some incorrect references. In this case, a incorrectly referenced node ignores client requests (Algorithm 3 line 12) when it finds out that it is not responsible for the target RSM. In the second scenario, it is possible that the client is correct but the current replica configuration contains some incorrect references. In this case, the node that discovers through the client request that it was supposed to be hosting a replica will attempt to correct the current configuration by sending a **ConfChange** request replacing the incorrect reference with the reference to itself (Algorithm 3 line 10). The scheduling is done by assigning the request to a slot that is agreed upon among all replicas in the configuration (using the Paxos algorithm). Meanwhile, scheduled requests are executed sequentially in the order of their slot numbers. These steps are shown in Algorithm 3. At execution time, the execution module will direct all requests except the **ConfChange** request to the service specific module for execution. The **ConfChange** will be directed to the management module for processing.

### 3.3.5 Handling Churn

Algorithm 5 shows how to maintain the replicated state machine in case of node join/leave/failure. When any of these cases happen, a new node may become responsible for hosting a replica. In case of node join, the

Algorithm 6: SM maintenance (handled by the container)

```

1: receipt of INITSM(RSMID, Rank, Conf) from m at n
2:   new SM ▷ Creates a new replica of the state machine
3:   SM.ID ← RSMID
4:   SM.Rank ← Rank ▷  $1 \leq Rank \leq f$ 
5:   SMs[RSMID][Rank] ← SM ▷ SMs stores all SM that node n is hosting
6:   SM.Start(Conf) ▷
7: end receipt

8: receipt of PULLSMS(Intervals) from m at n
9:   for each SM in SMs do
10:    if  $\mathbb{R}(SM.id, SM.rank) \in I$  then
11:      newSMs.add(SM)
12:    end if
13:   end for
14:   sendto m : NEWSMS(newSMs)
15: end receipt

16: receipt of NEWSMS(NewSMs) from m at n
17:   for each SM in NewSMs do
18:     JOINRSM(SM.id, SM.rank)
19:   end for
20: end receipt

```

new node will send a message to its successor to get information (RSMID and replication degree) about any replicas that the new node should be responsible for. In case of leave, the leaving node will send a message to its successor containing information about all replicas that it was hosting.

In the case of failure, the successor of the failed node needs to discover if the failed node was hosting any replicas. This can be done in a proactive way by checking all intervals (line 7) that are symmetric to the interval that the failed node was responsible for. One way to achieve this is by using interval-cast that can be efficiently implemented on SONs e.g. using bulk operations [15]. The discovery can also be done lazily using client requests as described in the previous section and Algorithm 3 line 10. The advantage of using lazy approach reduces message burden on the system. However, in the proactive way, the system does not have to depend on the client's request frequency and in this way, it could be more robust. Both of these approaches could be used together to make the system more fault-tolerant. All newly discovered replicas are handled by **NewsMs** (Algorithm 6). The node will request a configuration change by joining the corresponding RSM for each new replica. Note that the configuration size is fixed to  $f$ . A configuration change means replacing reference at position  $r$  in the configuration array with the reference of the node requesting the change.

### 3.3.6 Handling Multiple Configuration Change

When a migration request is submitted and decided, SMART [8] protocol is used to migrate a SM from one configuration to another. According to SMART, on execution of `migrate` request, leader in the configuration will assign its `LastSlot`, send `JOIN` message to host machines in the `NextConf` and will propose `null` requests for all the remaining unproposed slots until the `LastSlot`. However, the situation is unclear if another `ConfChange` request has already been proposed. It might happen, due to high churn rate, that multiple `ConfChange` requests are submitted to the leader at the same time. If two `ConfChange` will be executed by the same configuration, it could result in having multiple `NextConf` with the same `ConfID`. To avoid having this situation, as shown in algorithm 3, everytime a `ConfChange` request is executed, it will replace at position `r` in the configuration array with the reference of the node who requested this change. This way, only one `NextConf` will be created. This will make sure to avoid any conflicts due to multiple configurations with the same `ConfId` and also to have redundant configurations.

There can be different scenarios with multiple `ConfChange`. In one scenario, replicas placed on different nodes fails at the same time, the successors of all these nodes will get information from the ME group as explained before and will request for replacing the failed replicas with the newly created replicas. On the other hand, there can be a situation where multiple replicas are hosted on the same node in the overlay. This could happen due to high churn rate and less number of nodes available in the overlay. If that node fails, the successor of that node will pull all failed replicas, will create these replicas on its own node and will request for multiple `ConfChange` requests. To optimize this situation, the new node can also send a single `ConfChange` request with a list of new replicas to be replaced.

### 3.3.7 Reducing Migration Time

The system can become unresponsive during the migration time i.e. when `NextConf` is created and until it receives the `FINISH` message and a new leader is elected. This duration is very crucial for scalability and responsiveness of the system. In case of high-churn scenarios, there can be many migrations during a short span of time. An optimization, which is

Algorithm 7: SM maintenance (handled by RSM replica)

```

1: receipt of JOIN(RSMID, Rank, Conf, ConfId) from m at n
2:   SM ← SMs[RSMID][rank]
3:   if SM[ConfId].Started = false then                                     ▷ If Replica is not started yet
4:     SM[ConfId].leader = Conf[0]                                         ▷ Choosing lowest rank replica as leader
5:     STARTFELD(ConfId, RSMID, Rank, Conf, ConfId)                       ▷ Starting FELD
6:     if SM[ConfId].leader = n then STARTPROMISEPHASE(ConfId)         ▷ Paxos start
       promise phase
7:     end if
8:   end if
9: end receipt

10: receipt of ELECT(RSMID, Leader, Conf, ConfId) from m at n
11:   SM ← SMs[RSMID][rank]
12:   if SM[ConfId].leader = n then STARTPROMISEPHASE(ConfId)         ▷ Paxos start
       promise phase
13:   end if
14: end receipt

```

already proposed, is to wait for a certain number of replica failures in a RSM before deciding to migrate. This is also shown in figure 3 line 19 and will be referred as replica **Fault-Tolerance**. However, this does not reduce the time of migration when it happens. Migration time depends mainly on the time to detect failure and the leader election algorithm.

To handle this situation and to further optimize our algorithm, we have modified the startup of an RSM as shown in Algorithm 7. Our implemented  $\diamond$ f-Accessible Leader Election is choosing the lowest ranked most responsive replica as the leader. On joining an RSM, every SM will choose replica with lowest rank as the default leader before starting the leader election. Most of the time all the replicas in an RSM are alive and responsive. This would mean that, when a replica node will join the RSM it will assume replica with lowest rank as the default leader. This will reduce the migration time as replicas will start their Paxos's first phase without waiting for the leader election to finish.

In worst scenarios, if the lowest ranked replica is faulty (not working properly), then eventually a new leader will be chosen by the leader election and the leader then will start proposing the requests from pending request queue.



### 3.4 Applying Robust Management Elements In Niche

The autonomic manager in Niche is constructed from a set of management elements. To achieve robustness and high availability of Autonomic Managers, in spite of churn, we will apply the algorithm described in the previous section to management elements. Replicating management elements and automatically maintaining them will result in what we call Robust Management Element (RME). An RME will:

- be replicated to ensure fault-tolerance. This is achieved by replicating the service using the replicated state machine algorithm.
- survive continuous resource failures by automatically restoring failed replicas on other nodes. This is achieved using our proposed approach that will automatically migrate the RME replicas to new nodes when needed.
- maintain its state consistent among replicas. This is guaranteed by the replicated state machine algorithm and the migration mechanism used.
- provide its service with minimal disruption in spite of resource join/leave/fail (high availability). This is due to replication. In case of churn, remaining replicas can still provide the service.
- be location transparent (i.e. clients of the RME should be able to communicate with it regardless of its current location). The clients need only to know the `RME.ID` to be able to use an RME regardless of the location of individual replicas.

The RMEs are implemented by wrapping ordinary MEs inside a state machine. The ME will serve as the service specific module shown in Figure 3.2. However, to be able to use this approach, the ME must follow the same constraints as the execution module. That is the ME must be deterministic and provide checkpointing.

Typically, in replicated state machine approach, a client sends a request that is executed by the replicated state machine and gets a result back. In our case, to implement feedback loops, we have two kinds of clients from the point of view of an RMS. A set of sending client  $C_s$  that submit requests

to the RME and a set of receiving clients  $C_r$  that receive results from the RME. The  $C_s$  includes sensors and/or other (R)MEs and the  $C_r$  includes actuators and/or other (R)MEs.

To simplify the creation of control loops, that are formed in Niche by connecting RMEs together, we use a publish/subscribe mechanism. The publish/subscribe system delivers requests/responses to link different stages (RMEs) together to form a control loop.

# Chapter 4

## Implementation Details

To evaluate the performance of our approach and to show the practicality of our algorithms, we built a prototype implementation of Robust Management Elements using the *Kompics* [29] component model. As described before, Kompics is a framework for building and evaluating distributed systems in simulation, local execution and distributed deployments. For the underlying SON, we used Chord implementation that is provided by Kompics. This Chord implementation provides the functionality to resolve a SON Id to an address of the node responsible for it. Nodes are able to directly communicate with each other using this address. Every physical node know the range of SON Id:s it is currently responsible for. We use lookup and failure detection facilities from this implementation.

### 4.1 Underlying Assumptions

- A fail-stop model has been assumed i.e. nodes can fail only by stopping. Other models including byzantine failures will be handled in future.
- Messages are delivered fair-loss to alive replicas i.e. some messages can be lost.
- All assumption for Paxos and Replicated State Machine should hold e.g. Less than half of the nodes can fail. Majority of the nodes or quorum should stay alive.

## 4.2 Basic Underlying Architecture

### 4.2.1 Data structures

<b>Slots</b>	Every request received by RMEs is being assigned to virtual slots. This is used to ensure the order of requests execution by the RMEs. An RME can execute request from slot $n+1$ only if it had already executed input from slot $n$ .
<b>FirstSlot</b>	The starting slot number for a configuration to which the client requests can be assigned.
<b>LastSlot</b>	The last slot for a configuration to assign a request.
<b>ServiceState</b>	This is used to abstract the state of a replica. As described before, it consists of internal state of the service specific module, configurations (current and next configuration) and Paxos and SMART specific state information. The migration algorithm is responsible for specifying the <code>FirstSlot</code> and <code>LastSlot</code> for each configuration.
<b>PendingRequests</b>	Clients are sending requests to each replica in a configuration. Each replica, on receiving the requests, stores the requests in a <code>PendingRequests</code> list. If a request remains in the pending list for more than the allowed time, it is considered as expired and is resubmitted to the leader.

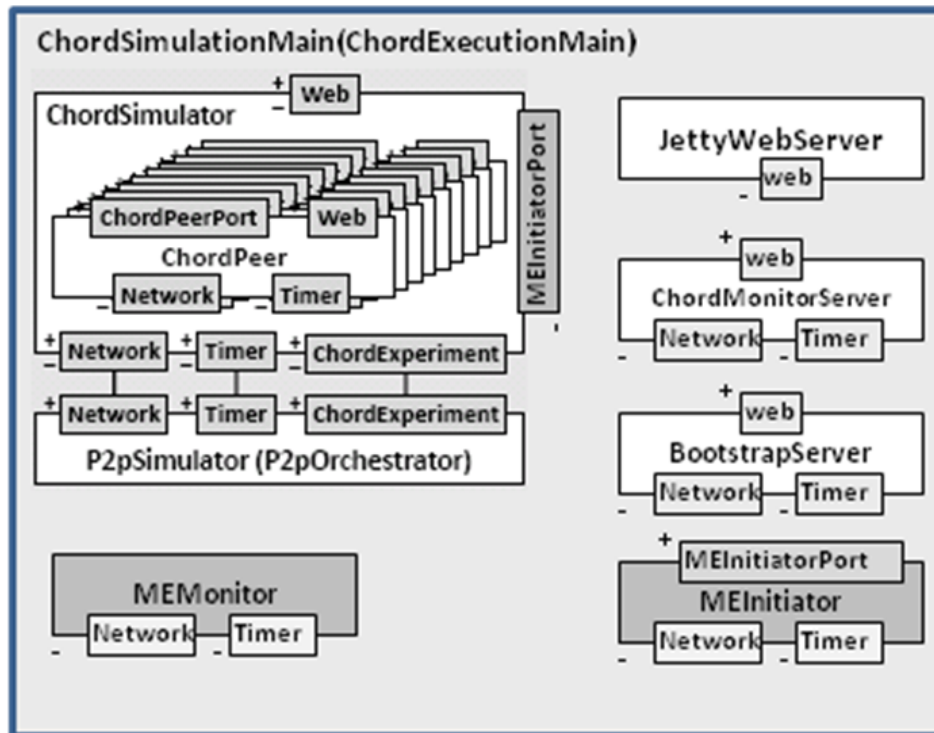


Figure 4.1: Robust Management Element components inside Kompics

**MERI** Used to uniquely identify a replica in an RSM. It Contains replica number (rank), SON ID, IP and address information of a particular replica in the configuration.

**MEI** Contains RSMID and replication degree. RSMID uniquely identifies an RSM and is used, together with replication degree, to find the replica IDs as specified in Algorithm 1.

### 4.2.2 Robust Management Element Components

The basic entities of the implemented prototype are MEInitiator, MEMonitor, MEContainer, MEReplica, MESensor and FELD. These entities are implemented as *Kompics* components and are shown in dark colors in the component diagrams below.

- MEInitiator** `MEInitiator` is responsible for initializing the system and starting up the RME configuration. It is implemented as a Kompics component and lies outside the structured overlay network (SON) component i.e. Chord in our case. It is shown in figure 4.1.
- MEMonitor** `MEMonitor` is used for evaluating system performance. It gathers all the data needed for calculating the latency and message overhead due to robust management elements. Just like `MEInitiator`, `MEMonitor` also lies outside of the structured overlay network.
- MEContainer** The DCMS runtime system consists of a set of distributed container processes on several physical nodes for hosting components (MEs and application components). `MEContainer` is an abstraction of these DCMS containers. Every node in structured overlay network will host a Container. A Container is responsible for getting requests from the Initiator for creating and starting a replica. When a predecessor of a `ChordPeer` fails, this information is also indicated to the `MEContainer`, which will then start the process to find and replace the failed ME. A Container can host multiple replicas which are uniquely identified by their MERI. Changes in the successors and predecessors of a node in the overlay are being informed to the Container. Container can also request the ME group to replace a replica with a new replica.

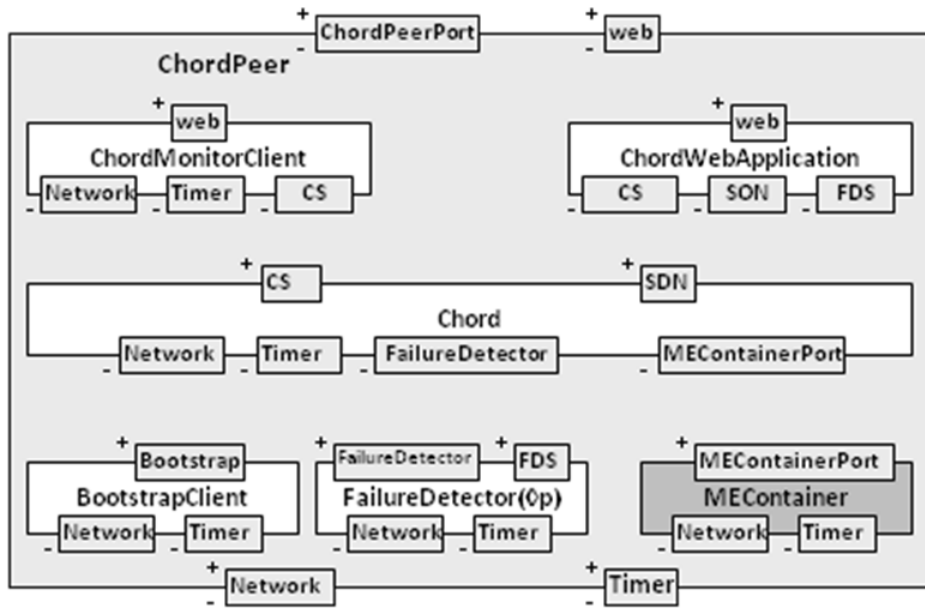


Figure 4.2: ChordPeer architecture with RME

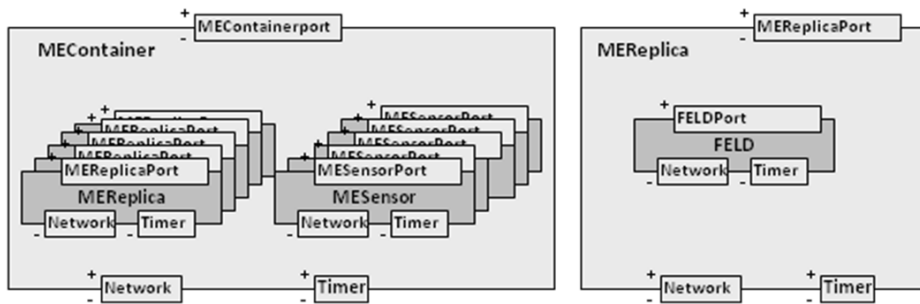


Figure 4.3: ChordPeer architecture with new components

**MEReplica** This is the main component entity responsible for implementing all the functionalities of a RME replica. When a replica is started, it is provided with its unique MERI in addition to RSMID and the replication degree. MERI uniquely identifies a MEReplica and consists of information including its SON ID, IP address and the physical node address. This can be used to directly communicate with a specific MEReplica. It is also provided the MERIs of all replicas that are part of the same configuration. MEReplica implements the SMART protocol for migration in addition to Paxos for deciding and executing client's requests.

**FELD** This component is used to implement the functionality of  $\diamond$ f-Accessible Leader Election [21]. When a MEReplica is started, it starts its **FELD** and provides the configuration Id and MERI of replicas which are part of the same configuration.

**MESensor** This entity is used to capture the abstraction of Sensors inside Niche framework. MESensors will generate requests periodically to **RSM** without waiting for the reply.

### 4.3 Node Join and Failures using Kompics

To fail a node, Kompics Chord framework provide a special message **ChordPeerFail** that can be used to fail a specific node in the overlay. It takes the overlay id of the node as part of the input message and will destroy the **ChordPeer**, along with all the components inside that **ChordPeer**. The failure of the node will be indicated to the successor **ChordPeer** and ultimately to its **MEContainer**.

To create a node in the Kompics Chord overlay, there is a special message **ChordPeerJoin** that can be used. It takes as input the SON ID of the node, creates a node and will try to join this node into an existing SON. If there is no already created SON, then it will create one and will make the node part of this SON. Every node has a **MEContainer** that is also created as part of the initialization.

### 4.4 System Startup

System starts when the **MEInitiator** gets a request to start an **RSM**. The system assumes that underlying SON is already initialized and contains some valid physical nodes. The request also contains a **MEI** with **RSMID** and replication degree for the **RSM**. The Initiator, on receiving this message, creates **MERI** for each replica by first calculating the symmetric Son Id and then getting the node address for this SON Id from the Chord overlay as



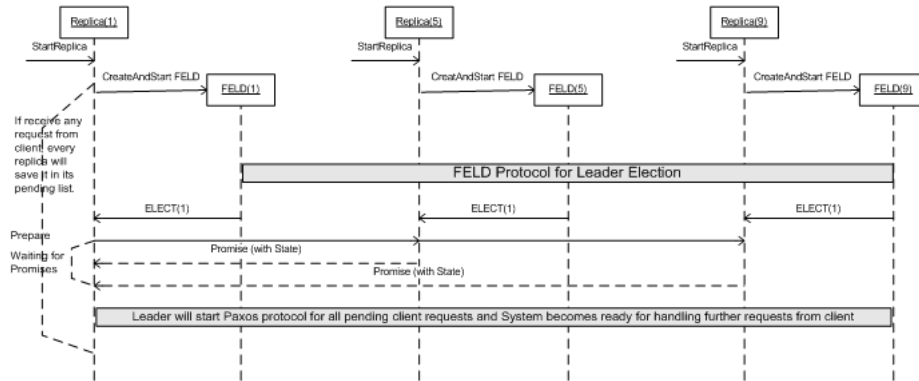


Figure 4.4: A simple non-optimized system startup

described in section 3. A simple scenario of system startup is shown in figure 4.4.

However, with the optimization as proposed in section 3.3.7, the replicas will choose the lowest ranked replica as the leader and the leader will start the promise phase, without waiting for the leader election.

## 4.5 Churn Model

The most important aspect of evaluating our algorithms is to verify its behavior in extreme churn scenarios. SMART has shown its experiments with a very basic and simple setup which is enough to understand the working of the SMART yet may not be enough to understand the scalability of a system. On the other hand, although Paxos for System builders [19] has shown paxos with respect to extreme scenario, but they did not involve failure of nodes in their tests, which is also very important to learn the scalability of the system.

To experiment the performance of our algorithms in various churn scenarios, we have used the *lifetime-based node failure* model [13, 30] with shifted Pareto lifetime Distribution. The sample java code of this model is shown below while a sample output of this algorithm is shown in Figure 4.5.

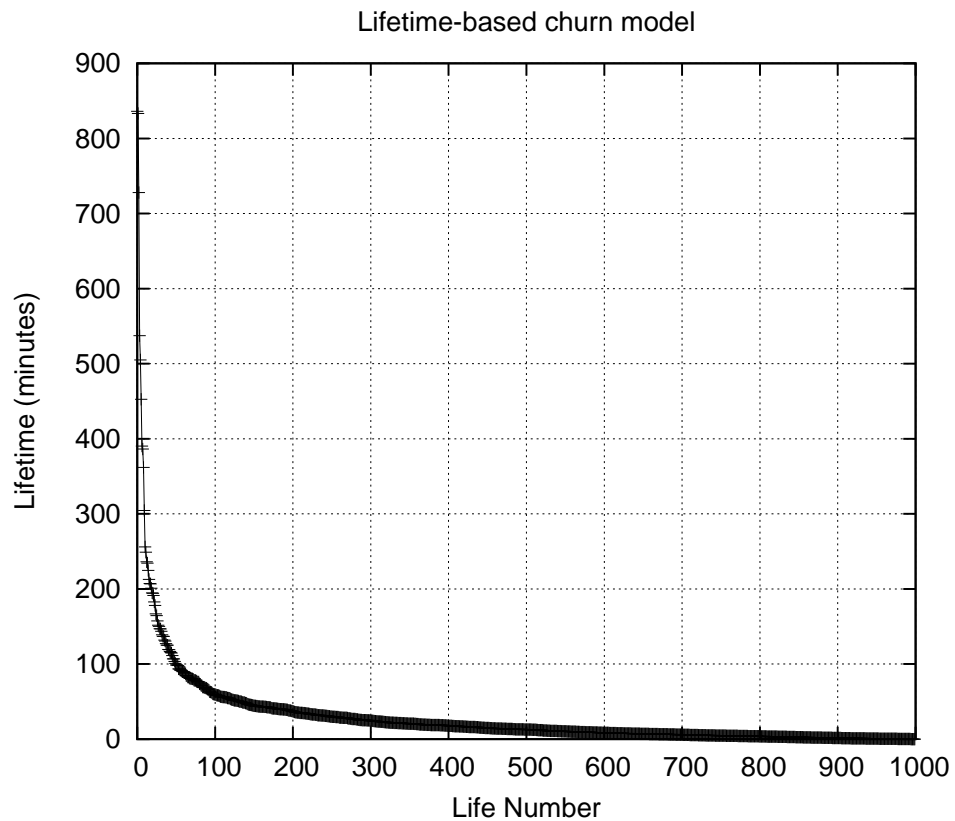


Figure 4.5: Lifetime model with average lifetime=30 and alpha=2

```
double rand = randomGenerator.nextDouble();
double avgLifeTimeInMinutes = 30;
double alpha = 2;
double beta = avgLifeTimeInMinutes * (alpha - 1);
double base = 1 - rand;
double power = -(1/alpha);
double powerResult = Math.pow(base, power);
double lifetime = beta * (powerResult - 1);
```

As you can see in figure 4.5, there are very few nodes with longer life-time, most of the nodes have very short life-time near to 0. Java Random() function is used to generate uniform random numbers. These random number are used to calculate lifetime.

The intensity of Churn depends on `averageLifeTimeInMinutes` variable. For high churn we used 30 and for low churn we used 150 minutes as its value.

When a node lifetime is finished, it is removed from the Chord and at the same time another node with a random Overlay Id is added into the system. This is to make sure that nodes will go up and down, but the mean number of nodes will be the same.

## 4.6 Client Request Model

In the experiments that we conducted, clients (sensors) are making requests to RSM. For the sake of simplicity, an integer data value is being replicated over RSM. Every sensor is issuing command to add or subtract some number from that stored data value. We have chosen this model to make the execution of the request as quickly as possible while still be able to watch the consistency of the replicated data.

In our experiments, we have tried to replicate the behaviour of a failure detector Sensor/Client inside Niche platform. Sensors are generating request with a modeled request frequency based on lifetime-based node failure model. This is to abstract the behaviour that Sensors are generating requests whenever there is some node failure detected. The algorithm of this model is similar to the one mentioned above for churn. Sample java code of Sensor's functionality is shown below:

1. Generate a random request.
2. Sleep for Pareto time, calculated as below:

```
double rand = randomGenerator.nextDouble();
int avgLifetimeInMs = nicheConfig.getSensorRequestAvgIntervalInMs();
double avgLifeTimeInSec = ((double)avgLifetimeInMs)/1000.0;
double alpha = 2;
double beta = avgLifeTimeInSec * (alpha - 1);
double base = 1 - rand;
double power = -(1/alpha);
double powerResult = Math.pow(base, power);
double finalResult = beta * (powerResult - 1);
int sleepTime = (int)(finalResult * 1000.00);
```

3. Wake up. Go to step 1.



# Chapter 5

## Analysis and Results

To evaluate the performance of our proposed model and to show the practicality of our algorithms, we built a prototype implementation of Robust Management Elements using the *Kompics* [29] component model. In this section we describe our experiments, the methodology of our experiments and the analysis of the results.

### 5.1 Testbed Environment

We used Kompics as an underlying framework to develop our prototype and conduct our experiments. More explanation about compics is described in section 2.7. Kompics provides an implementation of Chord that we used as our underlying structured overlay network. It provides lookup and failure detection facilities and also a unique id for each node including an IP address and port. This unique id can be used for direct communication with the destination node.

In order to make network simulation more realistic, we used King latency dataset, available at [31], that measures the latencies between DNS servers using the King [32] technique. To experiment the performance of our algorithms in various churn scenarios, we have used the *lifetime-based node failure* model [13, 30] with shifted Pareto lifetime Distribution.

## 5.2 Methodology

There are various factors in a dynamic distribution environment that can influence the performance of our approach. Input parameters include

- Numeric (architectural) parameters:
  - Number of RSM: 1
  - Number of clients: 4
  - Overlay size (the number of nodes) in the range 200 to 600
  - Replication degree which varies from 1 to 25. 1 means no replication (base-line case).
  - Fault Tolerance: this is the number of failures that will cause the RSM to migrate. This can range from 1 to strictly less than half of the number of replicas.
- Timing (operational) parameters
  - Pareto distribution of requests with a specified mean time between consecutive requests from a client to the RSM. It ranges from 500ms to 4 seconds.
  - Pareto distribution of churn events (joins and failures) with a specified mean time between consecutive churn events of 30 minutes (high churn rate), 90 minutes (medium churn rate), 150 minutes (low churn rate)

Clients send requests to the RSM that receives the requests, handles them (i.e. performs all the actions related to replicated state machine and makes a state transition) and finally replies to requesters. In our tests, we have enabled pipelining of requests as suggested by SMART. We are using alpha value equal to 10 i.e there can be 10 requests being handled by manager in parallel. In all plots, unless otherwise stated, we simulated 8 hours. The plot is the average of 10 independent runs with standard deviation bars.

We estimate performance of the manager as a request latency which is a time between sending a request to the manager and receiving a response from it. We also measure the complexity of the replication (including leader election and Paxos) and migration (including SMART and our algorithm)

caused by churn. We estimate the complexity as the number of messages due to replication and churn.

The base line in our evaluation is the system with no replication and no churn. We expect that the base-line system has highest performance compare to performance of a system with replication and with/without churn, because the replication mechanism as well as churn (migration caused by it) introduce performance overhead to maintain replication and to tolerate churn (to migrate SMs).

The difference in performance of the base-line system and a system with replication indicates the replication overhead and the overhead caused by churn (if any). There are three kinds of overhead in the system. (i) Paxos (which happens on arrival of requests to RSM), (ii) SM migration (which happens on churn), and (iii) leader election (which happens all the time). All the overheads cause increase in the number of messages and may cause performance degradation, i.e. increase of the request latency.

## 5.3 Experiments and Performance Evaluations

### 5.3.1 Request Timeline

we conducted our first experiment to present the timeline of a single request with constant link latency of 1ms. This test setup has a single RSM with a replication degree 10 and overlay node size 200. Although in later experiments, the underlying network delay is using King latency map, yet the idea of this experiment is to show the validity of the implemented system and a very basic idea about a single request handling. As shown in figure 5.1, the processing time on each SM is almost zero.

Similar to the above experiment, we conducted another experiment to show the effect of network delay on the client's request latency. As shown in figure 5.2, the request latency increases in propotion to the network delay. Here also, the network delay is constant and is not based on King Latency Map [32]

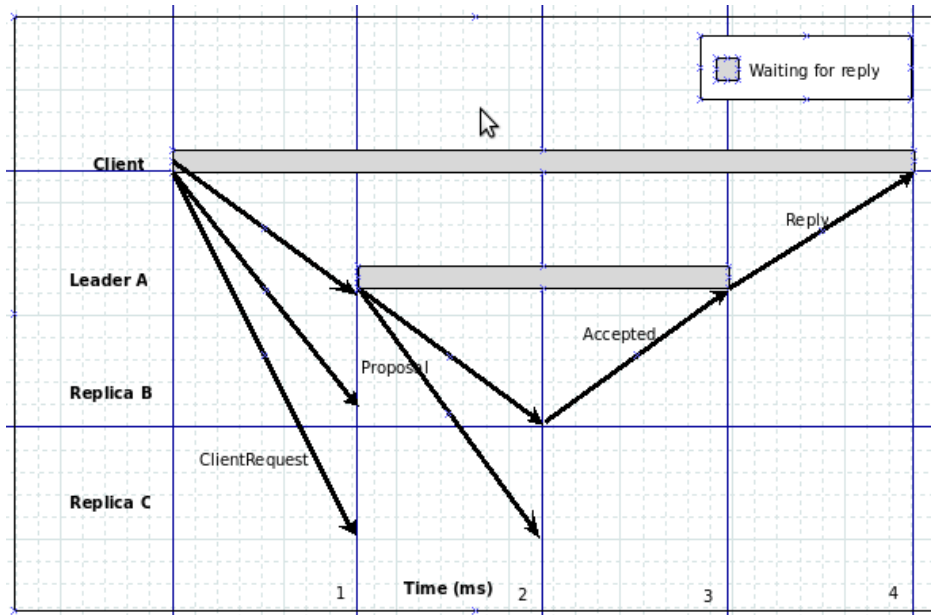


Figure 5.1: Effect of additional network delay on the latency

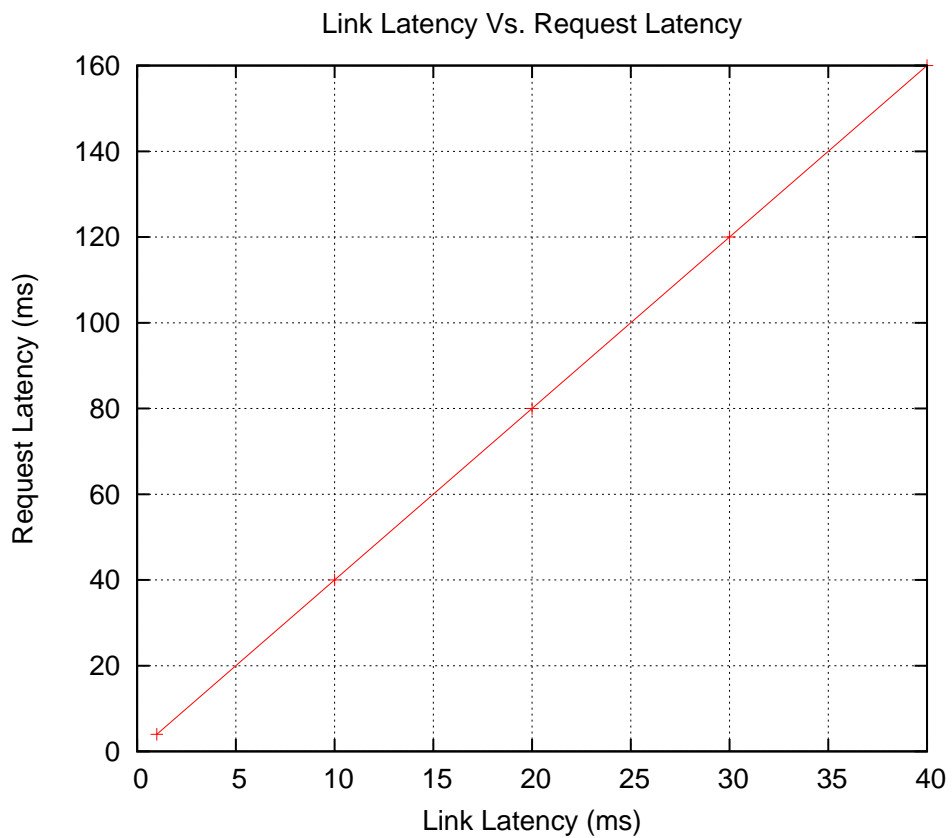


Figure 5.2: Effect of additional network delay on the latency



### 5.3.2 Effect of Churn on RSM Performance

To get the effect of churn on the performance of robust management elements, we conducted experiment as shown in figure 5.3 . This figure depicts all requests latency for a single client during 8 hours of high churn rate. Every other parameter was kept constant as described before. `Fault-Tolerance` was set to 1 i.e. system will migrate after any replica failure. The replication degree was set to 10 in this experiment. During these 8 hours, around 100 replica failure happened. However, the effect of a non-leader replica failure is minimal and this is because of the optimization that we did for leader selection during migration. This is described in section 3.3.7.

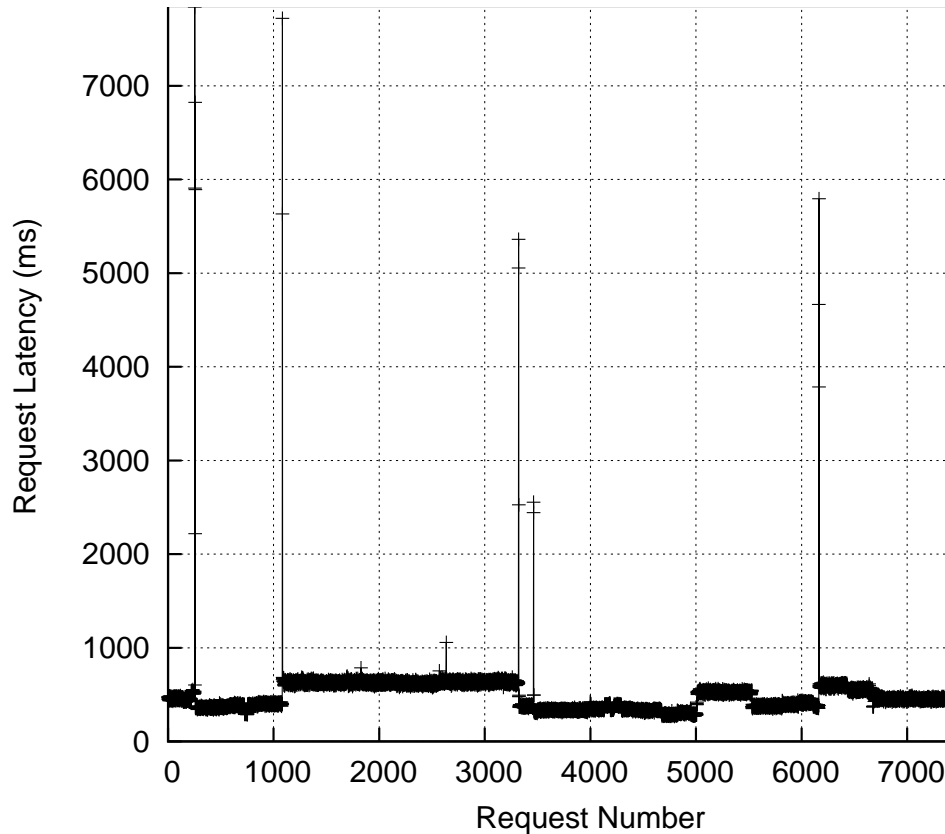


Figure 5.3: Request latency for a single client (high churn)

Out of more than 7000 requests only less than 20 requests were severely affected. The spike happened when the leader in Paxos algorithm fails. This is because Paxos can not proceed (assign the request to a slot) until a new leader is elected. This delay is around 6 seconds on average, and

mainly depends on the time taken to detect the failure of the current leader and electing a new leader according to the leader election parameters used in the simulations. During this time any request that arrive at the RSM will be delayed. Non-leader failure does not seem to pose much impact on the performance. In this experiment, a migration due to non-leader replica takes on average around 300 milliseconds to complete.

### 5.3.3 Effect of Replication Degree on RSM Performance

To check the performance overhead due to replication degree, we conducted various experiments while keeping all the parameters fixed and varying the replication degree. We changed replication degree from 1 to 25 while keeping the overlay node size 500, client request frequency as 4 seconds and number of clients as 4. The effect of replication degree on the client request latency is shown in figure 5.4. Experiments result data is written in appendix B

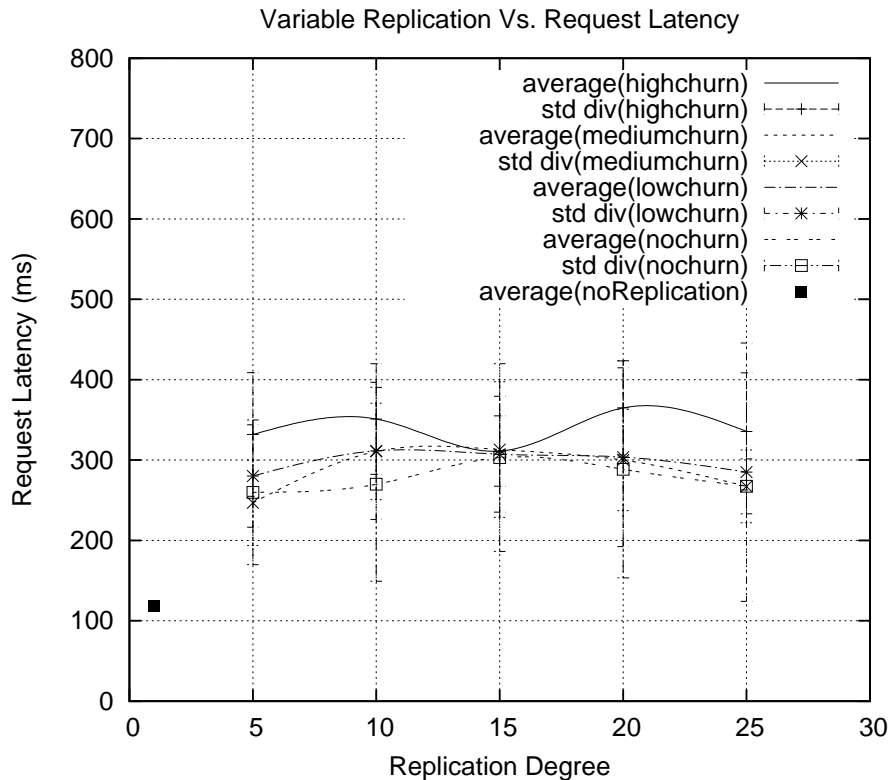


Figure 5.4: Effect of Replication Degree on request latency

From the figure 5.4, we can see that the replication degree does increase the request latency if we compare it with the non-replicated system. However, the situation does not become worse if the replication degree is increased. Infact, increasing replication degree does not seem to have any impact over the request latency. This is due to the fact that processing time on a single replica is almost equivalent to zero. That means sending a message to one replica or multiple replicas takes the same amount of time. To further verify this conclusion and keeping in view our previous experiment about churn effect on the performance, we concluded that churn (node failures) effect happens severely when a leader replica fails. So, we performed more experiments with variable replication degree and calculated the failure count of Leader Replicas. These experiments were conducted with different churn rates as shown in figure 5.7. Figure 5.7 shows churn rate has an obvious impact on the leader replica failures i.e. the higher the churn rate, the more leader replicas will fail. However, the replication degree does not seems to have much relation with the leader replica failures.

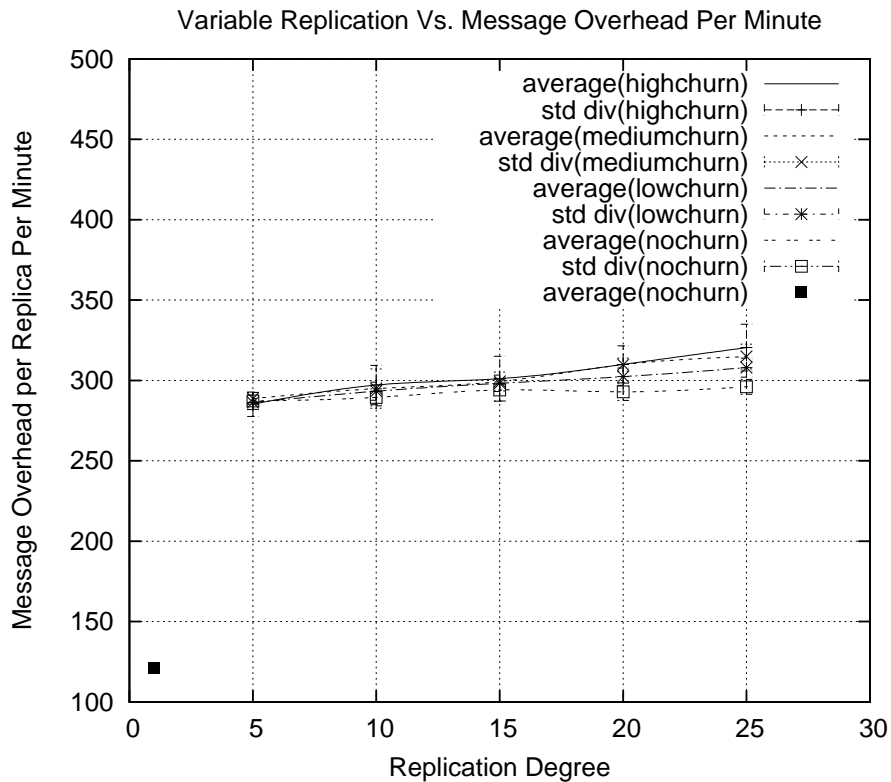


Figure 5.5: Single Request timeline

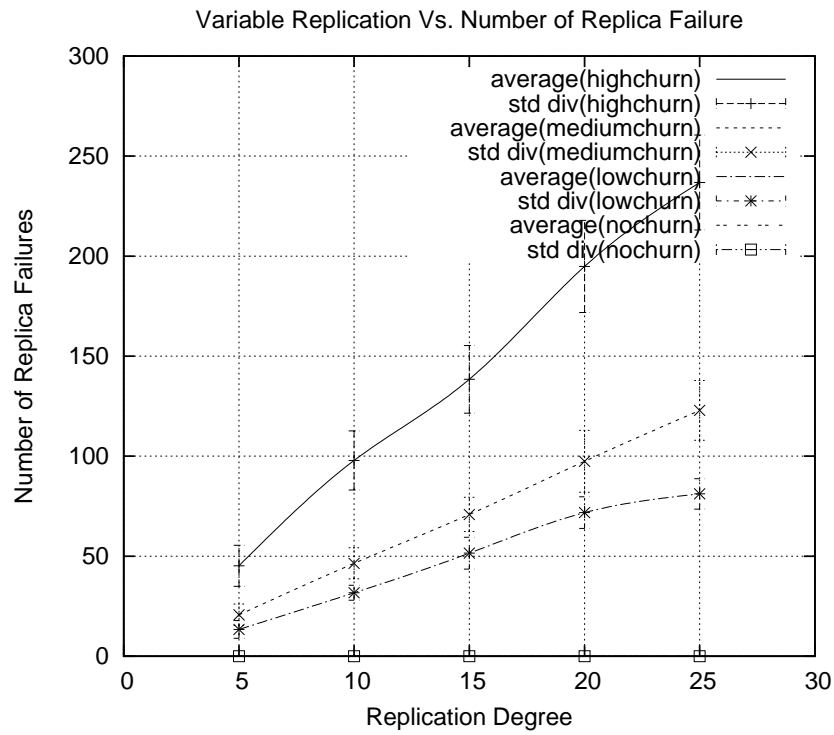


Figure 5.6: Effect of Replication Degree on Average Replica Failures

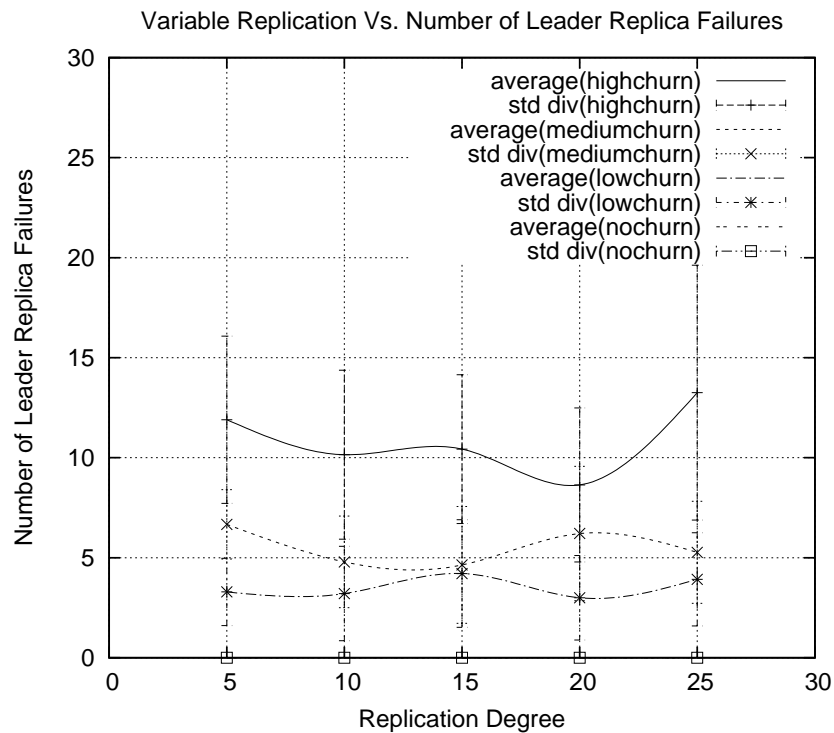


Figure 5.7: Effect of Replication Degree on Leader Replica Failures

To check the impact of replication degree over message overhead we conducted further experiments. As shown in figure 5.5 replication degree does increase the message overhead two to three times compared to no replication. This increase is mainly due to Paxos messages for every request. These messages further increases if we increase the replication degree. However, if we compare the message overhead per replica per minute, then this difference becomes negligible as shown in figure 5.5. Although, there is still a slight increase in message overhead while increasing the replication degree. This is because, when the replication degree is high, there are more replica failures. This is also shown in figure 5.6. And in addition to that, when the replication degree is high, there are more messages for migration. However, as shown in 5.6, there are 50 replica failures for replication degree 5 during 8 hours of simulation and 100 replica failures for replication degree 10. These are quite low compared to the Paxos messages due to large number of requests from the client. So, SMART or migration messages are not putting much impact on the curve in figure 5.5.

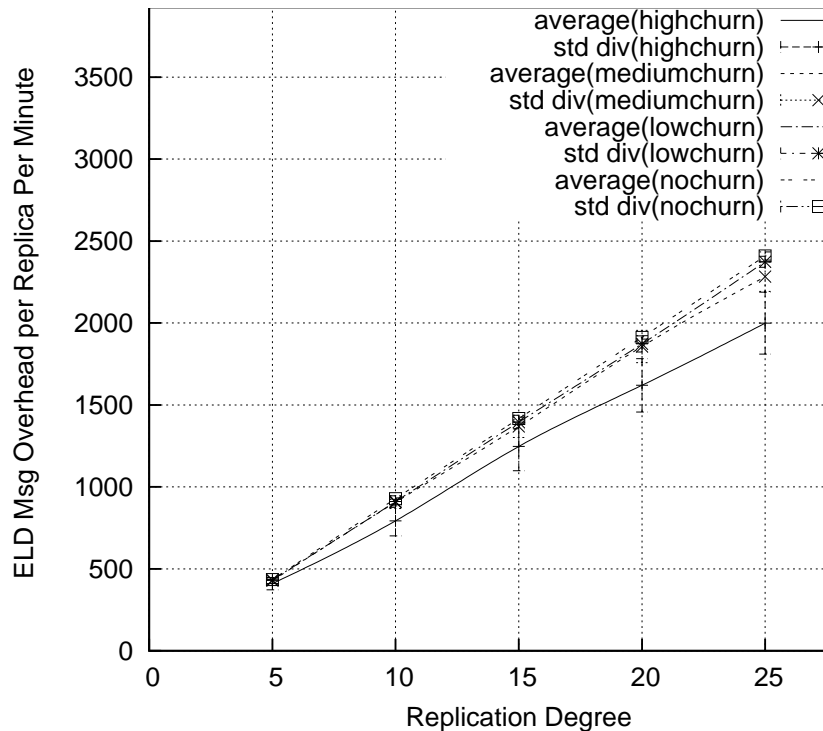


Figure 5.8: Effect of Replication Degree on Leader Election Messages

The effect of replication degree over leader election messages is shown

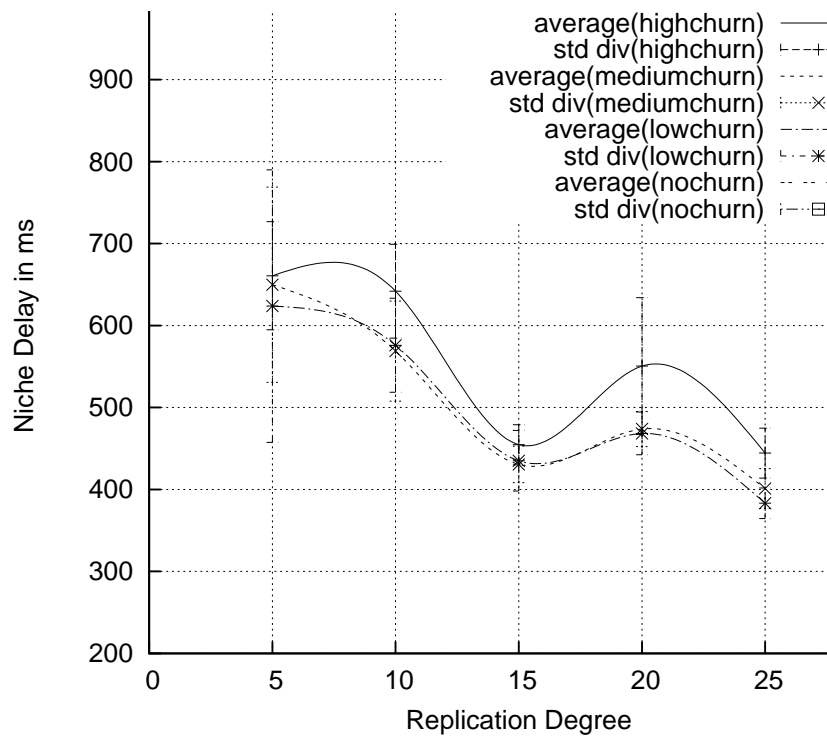


Figure 5.9: Effect of Replication Degree on Recovery Delay

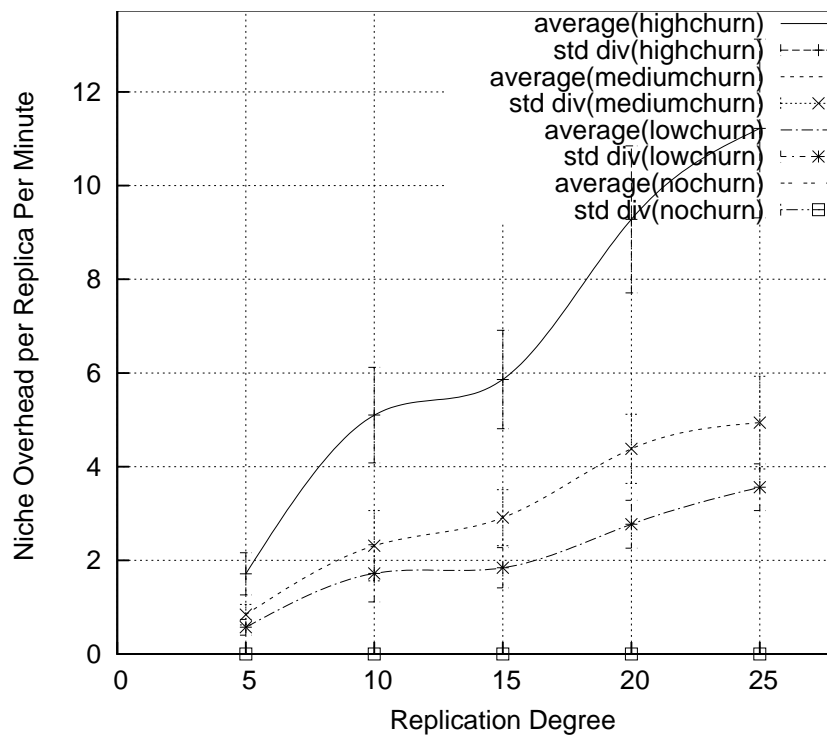


Figure 5.10: Effect of Replication Degree on Recovery Message Overhead

in figure 5.8. As expected, the leader election message increases with increase in replication degree. In other experiments, the effect of replication degree on discovery messages and delay is shown in figure 5.9 and figure 5.10. In these figures, **Recovery Messages** are referred to as **Niche Overhead** and similarly **Recovery Delay** is referred to as **Niche Delay**. Recovery messages are those messages that are used to discover a failed replica due to churn. Whereas, **Recovery Delay** is the time to discover a failed replica. The discovery delay decreases with more replicas. This is because discovering one replica is sufficient and with more replicas the higher probability to find a close replica (in terms of link latency). More detail about **Recovery Messages** and **Recovery Delay** are explained in section 5.4.2.

### 5.3.4 Optimization using Fault Tolerance (Failure Tolerance)

As shown in figures 5.5, figure 5.8 and figure 5.10, replication degree does have an influence over the message overhead. The more replication degree the more number of messages in the system. To reduce these messages and to further optimize our solution, we did further experiments while increasing fault tolerance. This optimization is discussed in more detail in section 3.3.7. The result of these experiments is shown in figure 5.11. Fault tolerance of 1 means that the RSM will migrate immediately after a failure while fault tolerance of 10 means that the RSM will wait for 10 replica failures before migrating. For making the results more obvious and easy to understand, we set the request frequency of four clients to 1000ms for this experiment and used replication degree as 25.

From this figure 5.11, it is clear that increase in failure-tolerance does decrease the number of messages (Paxos and Migration). This optimization is important for making our proposal suitable in scenarios with high churn rate.

### 5.3.5 Effect of Overlay Node Count on RSM Performance

In another set of experiments, we tested the effect of overlay node count on the RSM performance. We kept the replication degree to 10 and the sensor

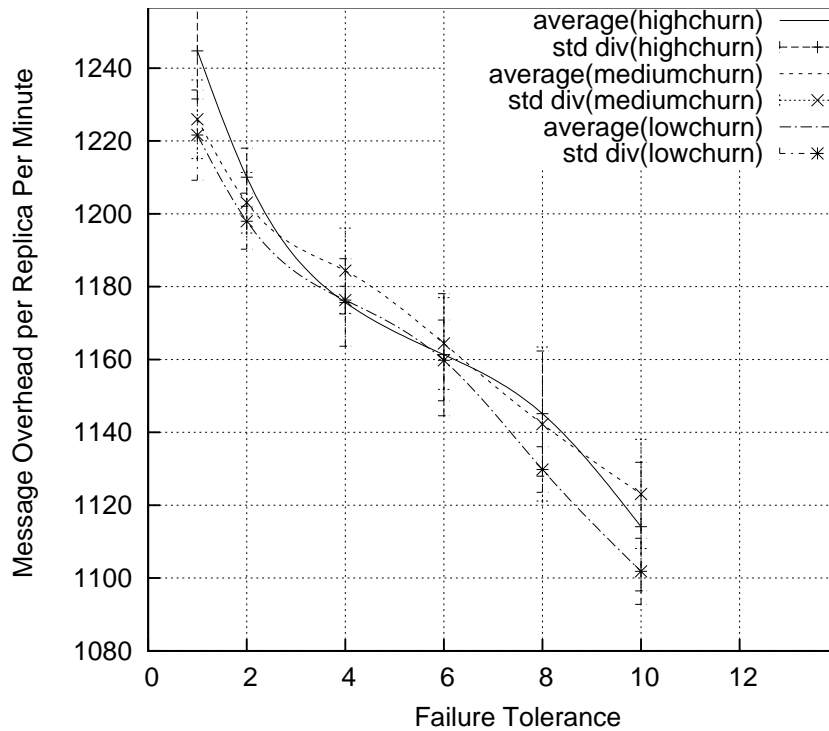


Figure 5.11: Effect of Fault Tolerance on Message Overhead (replication degree = 25)

count to 4 for these experiments. The sensors were making requests with mean average interval of 4 seconds. The results of these experiments are shown in figure 5.12 and figure 5.13.

As shown in figure 5.13, overlay node count does not have any impact over message overhead (SMART+Paxos). However, according to figure 5.12 increase in overlay node count is slightly increasing the client request latency. This is due to the fact that if there are more nodes in the overlay, the replicas will be more widely dispersed inside SON. As we are using King Latency Map for network delay, so the more dispersed the replicas are the more time it will take for communicating with each other i.e. more time for request handling.

### 5.3.6 Effect of Request Frequency on RSM Performance

In addition to the above experiments, we conducted another series of experiments in which we tested the performance of RSM with different



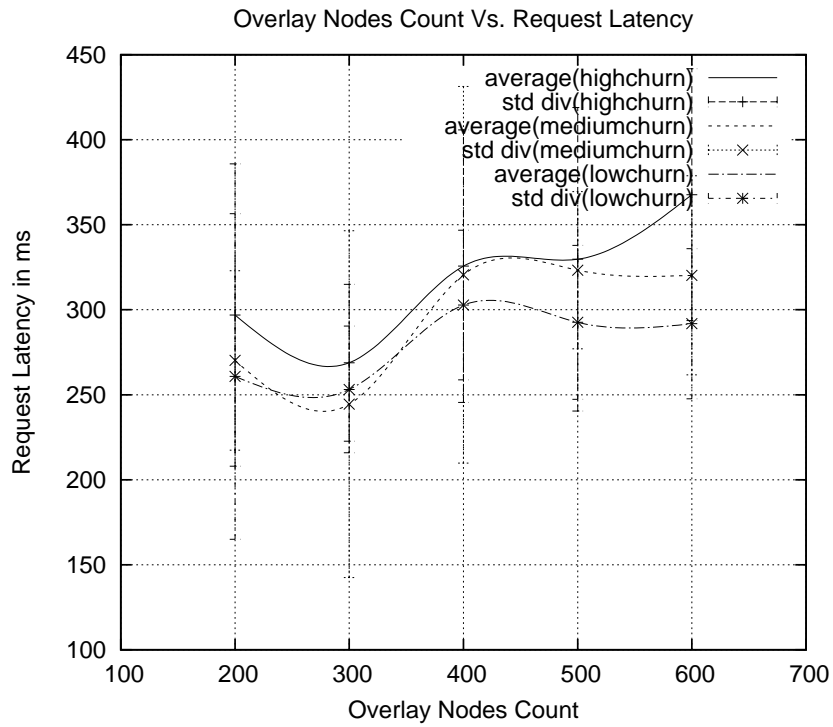


Figure 5.12: Request latency for variable Overlay Node Count

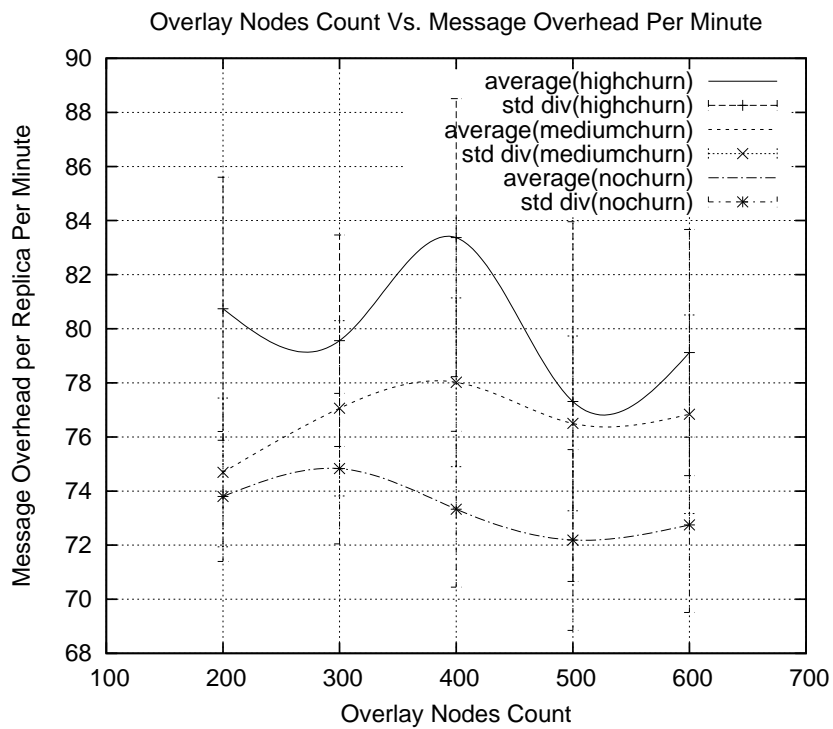


Figure 5.13: Message overhead for variable Overlay Node Count

client's request frequencies. Normally, in previous experiments, clients/sensors were making requests to RSM with a mean average request frequency of 4 seconds. As there were 4 sensors that were making the requests, so in effect the mean average request frequency was 1 second. However, in these experiments, the request frequency is changed from 500ms to 2500ms. These settings are made to be sure to overload the RSMs and get some impact due to request frequency. The result of these experiments are shown in figures 5.14 and 5.15. We only performed relevant experiments under this category i.e. **Request Frequency Vs. Leader Election Messages** does not make any sense as ELD messages are highly unlikely to be effected by an increase in request frequency.

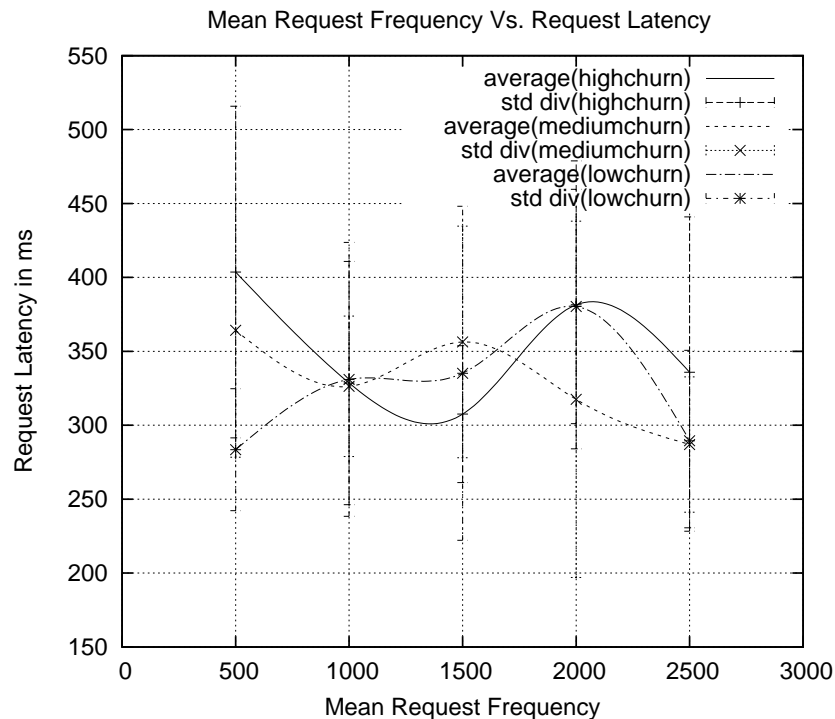


Figure 5.14: Request Latency for variable request frequency

Figure 5.14 shows that when request frequency is around 500ms and 4 sensors are making continuous requests based on client request frequency model 5.3.6, then higher churn has more impact on latency over lower churns. This is because of the fact that RSM is constantly overloaded by pending messages and the more the RSM has to migrate, the longer will be these pending message queue. However, this difference reduces when we decrease the request frequency to 1000 or beyond. When analyzing these

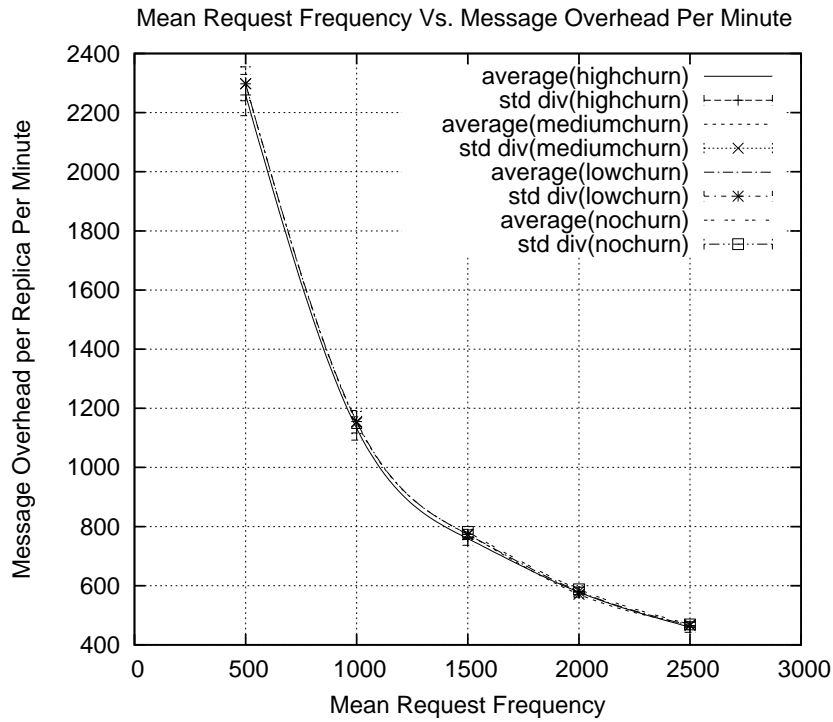


Figure 5.15: Recovery Message Overhead for variable request frequency

results, the reader should also take into account the fact that migration time heavily depends on failure detection and leader election time.

If we analyze the effect of request frequency over message overhead (SMART+Paxos), it is clearly obvious from figure 5.15 that the higher the request frequency, the more will be the messages. The shape of the curve is also due to the frequency request model that clients are using to generate requests. The detail of this request model is explained in section .

## 5.4 Summary of Evaluation

In evaluating the performance we are mainly interested in measuring the *message complexity* and the *time complexity* of our approach. The evaluation is divided in three main categories: critical path evaluation, failure recovery evaluation, and periodic maintenance of the SON and leader election.

### 5.4.1 Request Critical Path

In this category, we studied the input parameters that has impact on the time and message complexity related to handling client requests. This does not include the lookup preformed by clients to discover the replica set (configuration). This is because it is not on the critical path. Clients may cache the configuration or periodically update it. For this reason the performance is not affected by the overlay size because all critical messages (Paxos and Migration) involve direct links that do not use the overlay. Leader election messages are also not included for the same reason and this issue is discussed below.

The effect of churn on performance (request latency) is minimal unless the system is overloaded with pending messages. As discussed in section 5.3.2 and shown in Figure 5.3, out of more than 7000 requests only less that 20 requests where severely affected. The spike is due to leader replica failure.

The number of critical messages (Paxos and Migration) is affected by the replication degree. This is because of the Paxos algorithm that requires more messages to reach consensus with higher number of replicas. However, as shown in Figure 5.5 if we calculate the message overhead per replica per minute, difference in message overhead per replica becomes negligible for different replication degrees. Only Migration messages then remains the obvious influencing factor. On the other hand, as shown in figure 5.4, request latency is not affected due to increase in replication degree because Paxos requires two phases regardless of the number of messages. The number of messages is also affected by churn because the higher the churn the more migration is required.

The number of critical messages is also affected by the fault tolerance parameter. Higher fault tolerance means that the RSM waits more before it decides to migrate and thus requires less messages. Figure 5.11 shows the message overhead for an RSM with 25 replicas and variable fault tolerance.

### 5.4.2 Fault Recovery

When an overlay node fails another node (the successor) becomes responsible for any replicas on the failed node. The successor node need to discover if any replicas where hosted on the failed mode. In the simulation experiments we used overlay range cast to do the discovery. This process

is not on the critical path for processing client requests since both can happen in parallel.

Figure 5.9 depicts the average discovery delay of replica failures for different replication degree. The discovery delay decreases with more replicas. This is because discovering one replica is sufficient and with more replicas the higher probability to find a close replica (in terms of link latency). As shown in Figure 5.10 higher rates of churn requires more fault recovery and thus higher message overhead.

### 5.4.3 Other Overheads

Maintaining the SON introduces overhead in term of messages. We did not include these messages in our study because they vary a lot depending on the type of the overlay and the configuration parameters. One important parameter is the failure detection period that affects the delay between a node failure and the notification produced by the SON. This delay is configurable and was not included in the previous section when discussing the discovery delay.

Another source of message overhead is the leader election algorithm. Figure 5.8 shows the average number of leader election algorithm for different replication degree. The number of messages increases linearly with the number of replicas. This overhead is configurable and affects the period between leader failure and the election of a new leader. In our simulations this delay was configured to be maximum 10 seconds. This delay is on the critical path and affects the execution of requests as discussed in section 5.4.1.



# Chapter 6

## Conclusion

In this report, we presented an approach to achieve robust management elements that will simplify the construction of autonomic managers. The approach uses replicated state machines and relies on our proposed algorithm to automate replicated state machine migration in order to tolerate churn. The algorithm uses symmetric replication, which is a replication scheme used in structured overlay networks, to decide on the placement of replicas and to monitor them. The replicated state machine is used, beside its main purpose of providing the service, to process monitoring information and to decide when to migrate. Although in this paper we discussed the use of our approach to achieve robust management elements, we believe that this approach might be used to replicate other services in structured overlay networks in general.

### 6.1 Answers to Research Questions

Let us now address those research questions that I mentioned in the introduction of this report:

**RQ-01 :** Replication by itself is not enough to guarantee long running services in the presence of continuous churn. This is because the number of failed nodes hosting ME replicas will increase with time. Eventually this will cause the service to stop. Therefore, we use service migration [8] to enable the reconfiguration of the set of nodes hosting ME replicas. However, all this process should be self-automated. How to automate re-configuration of replica set in order to tolerate continuous churn?

**Findings** This report proposed a decentralized algorithm 5 that will use migration to automatically reconfigure the set of nodes hosting ME replicas. It contains a special module called `Container` that exist on all nodes of the overlay and is responsible for monitoring and detecting changes in the replica set caused by churn. More detail is given in section `sec:handlingchurn`.

**RQ-02 :** Reconfiguration or migration of MEs will cause extra delay in request processing. How to minimize this effect?

**Findings** As described in section 3.3.7, we proposed to reduce migration time by letting all replicas in a configuration to choose a common leader before starting the leader-election process. For example, every replica when starts choose replica with lowest rank as the default leader. This would mean to start the prepare phase immediately without waiting for leader-election to choose a leader. In addition to that, number of migrations can be controlled using `Fault-Tolerance` as described in section 3.3.7.

**RQ-03 :** Replication of MEs will result in extra overhead on the performance of the system. How to control this extra overhead?

**Findings** Replication of MEs does have an impact on the request latency if we compare it with a non-replicated ME. However, in a RSM, increasing this replication degree further does not increase the request latency as shown in figure 5.4. This is with the assumption that processing time of messages on any replica is zero. On the other hand, SMART and failure replica discovery messages does increase due to increase in replication degree. This can be further controlled and optimized using `Fault-Tolerance` as described in section 3.3.7.



**RQ-04 :** When a migration request is submitted and decided, according to SMART, on execution of migrate request, leader in the configuration will assign its `LastSlot`, send `JOIN` message to host machines in the `NextConf` and will propose null requests for all the remaining unproposed slots until the `LastSlot`. However, the solution is unclear if another configuration change request has already been proposed. It might happen, due to high churn rate, that multiple configuration change requests are submitted to the leader at the same time. If two configuration change will be executed by the same configuration, it could result in having multiple `NextConf` with the same `ConfID` i.e. duplicate and redundant configurations. How to avoid this scenario?

**Findings** To avoid having this situation, as shown in algorithm 3 and described in section 3.3.6 , everytime a `ConfChange` request is executed, it will replace at position `r` in the configuration array with the reference of the node who requested this change. This way, only one `NextConf` will be created. This will make sure to avoid any conflicts due to multiple configurations with the same `ConfId` and also to have redundant configurations.

**RQ-05 :** How to make the system scalable i.e. how to control the system performance when it is overloaded and churn rate is high?

**Findings** When the system is overloaded with client's requests, the performance of the system can be optimized by incrementing the pipeline i.e. the number of requests being handled in parallel. However, in overloaded scenarios, the churn or migration effect can become obvious. The maximum impact of Churn or Migration happens when a leader replica fails. As shown in figure 5.11, churn effect can be further controlled using `Fault-Tolerance` i.e. waiting for a certain number of replica failures before deciding to migrate.

**RQ-06 :** How overlay node count effects the performance of replicated MEs?

**Findings** As shown in figure 5.5, overlay node count does not seem to have any impact over message overhead (SMART+Paxos). However, increase in overlay node count is slightly increasing the client request latency. This is due to the fact that if there are more nodes in the overlay, the replicas will be more widely dispersed inside SON. As we are using King Latency Map for network delay, so the more replicas will be dispersed, the more time it will take for communication with each other.

**RQ-07 :** We have assumed a fair-loss model of message delivery. That means, some messages can be lost even when sending them to alive replicas. How to handle these lost messages.

**Findings** To increase the probability of handling every message sent by the clients, every client will submit the requests to each replica in a RSM. Each non-leader replica, on receiving the message, will forward the message to the leader replica, which will ignore duplicate messages. This approach might result in overloading leader with too many messages, especially when the degree of replication is large. To avoid this situation, there is another mechanism that has been tested. Each received message should be tagged with the received timestamp and should be stored by each replica in a pending requests queue. Periodically, every replica checks the pending requests queue and if a request has been in the pending list for a long time, it is retransmitted to the leader. More detail is described in section 3.3.3 and algorithm 4. Once the request is decided, it is removed from the pending list.

**RQ-08 :** What are the factors other than replication and request frequency that can influence the performance of a replicated state machine?

**Findings** There are many other factors that can influence the performance of RME system. Most important of these are: failure detection time (the time to detect a failure), leader election time, churn rate and the fault-tolerance factor. If the failure detection and leader election time is short, it will reduce **discovery delay**, however, it will put an extra burden of running these protocol too often i.e. more messages. So these parameters should be chosen carefully.

## 6.2 Summary and future work

In order to validate and evaluate our approach, we have implemented a prototype that includes the proposed algorithms. We conducted various simulation tests that validated our approach and showed its performance in various scenarios. In our future work, we will integrate the implemented prototype with the Niche platform to support robust management elements in self-managing distributed applications. We also intend to optimise the algorithm in order to reduce the amount of messages and we will investigate the effect of the publish/subscribe system used to construct control loops and try to optimise it. In addition to that, we will verify how our proposal works in overlays other than Chord. This will give us good understanding of how generic our approach is. Finally, we will try to apply our approach to other problems in the field of distributed computing.



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# Appendices



# Appendix A

## How to use our Prototype

We have made a prototype implementation of our proposed model using kompics framework. A framework for testing has also been implemented where user can define tests in a file and can run the tests for a longer duration of time. In this chapter, we will describe how the user can use this test framework. The package can be provided to the user on request.

### A.1 Package Contents

The provided package will contain the following important files:

**niche.jar** Prototype implementation of our proposed model.

**log4j.properties** For defining log level.

**tests.in** Refined experiments.

**NicheExperiments.class** Experiment test framework main class.

**Stats.class** Class to calculate the result statistics.

**TestResult.class** Class to process the results.

### A.2 Defining Experiments

A test framework is provided with our prototype that can be used to run a batch of experiments. These experiments are defined in file `tests.in`. The

syntax to define tests is as follows:

```

TestCycles
OverlayNodeCount
ReplicationDegree
TolerateFailures
SensorCount
SensorStartDelayInMin
SensorRequestAvgIntervalInMs
TestDurationInMin
nodeAverageLifeTime
linkLatency
seed
F-ReplicaNumber-Interval

```

Here is the description of the parameters;

**TestCycles** Number of cycles for a particular test.

**OverlayNodeCount** These number of nodes will be created in Kompics Chord overlay before starting the experiment.

**ReplicationDegree** Number of RMEs in an RSM.

**TolerateFailures** This will instruct the experiment to weight for give number of failure of replicas in an RSM before deciding to migrate.

**SensorCount** Number of clients/sensors making the requests to the RSM.

**SensorStartDelayInMin** Delay for the sensors before starting the requests. Sensors should be started after enough time e.g. 60 minutes, for the system to initialize itself properly.

**SensorRequestAvgIntervalInMs** Sensor request frequency depends upon this parameter. This specifies the mean average interval between two requests of the sensor. The sensor request model is defined using life-base model with shifted pareto distribution.

**TestDurationInMin** Test Duration in Minutes. Test duration starts after the sensors start making the requests.

**nodeAverageLifeTime** This is an alpha value for *lifetime-based node failure* model [13, 30] with shifted Pareto lifetime Distribution. Used to generate Churn in the system. A zero value means no churn.

**linkLatency** Should be set to 0. 0 means the King [32] technique. Otherwise the specified value will be used as latency for every link in the system.

**seed** A random value for the initialization of the system.

**F-ReplicaNumber-Interval** should be set to NoExplicitFailure.

A test file `tests.in` is provided with the package and it already has some sample defined experiments. A chunk of experiments, from this file, is shown below. In these experiments, we are testing the effect of replication degree on the system. The replication degree varies from 1 to 25 while 1 means no replication.

```
1 500 1 1 4 60 4000 480 0 0 0 NoExplicitFailure
1 500 5 1 4 60 4000 480 0 0 0 NoExplicitFailure
1 500 10 1 4 60 4000 480 0 0 0 NoExplicitFailure
1 500 15 1 4 60 4000 480 0 0 0 NoExplicitFailure
1 500 20 1 4 60 4000 480 0 0 0 NoExplicitFailure
1 500 25 1 4 60 4000 480 0 0 0 NoExplicitFailure
```

## A.3 Defining Log Levels

User can define log levels for the experiment inside `log4j.properties` file. This file is provided as part of the package. The main module of the experiments is `log4j.logger.se.kth.niche` whos level is set to OFF. The user can increase the loglevel by changing its value. The available log levels are: TRACE, DEBUG, INFO, WARN, ERROR, FATAL.

When the tests are executed, the results and logs will be generated in a folder named “Log“. This Log folder will be created in the same directory as the executable jar file. Some of the important log files are:

**smart.log** This will log information about the migrations and replica failures happening inside the system.

**niche.log** General logging of the system

**nichedelay.log** Logging recovery delay for each replica failure.

**sensorXXX.log** Information about sensor requests and the latency of each request is logged here.

Once a test is complete, a subdirectory inside `Log` will be created and these log files will be moved to that directory.

## A.4 Running Experiments

After defining the experiments, the user can start the tests using the following command.

```
>>java -jar NicheExperiments tests.in
```

If the tests has been defined in a file different than `tests.in`, provide the name of that test file instead of `tests.in` above.

## A.5 Collecting Results

All the defined tests in the file are executed in sequence. If any of the test is complete, it's result will be logged in file `Tests.result` with its unique `testId`. The result of an experiment is a single line and consists of following values in the sequence described:

```
TestCycles  
OverlayNodeCount  
ReplicationDegree  
TolerateFailures  
SensorCount  
SensorStartDelayInMin  
SensorRequestAvgIntervalInMs  
TestDurationInMin  
nodeAverageLifeTime  
linkLatency
```

```

seed
totalSensorRequest
averageRequestLatency
averageLinkDelay
averageNicheDelay
nicheMsgCountPerReplicaPerMinute (Paxos+SMART)
nicheEldMsgCountPerReplicaPerMinute
nicheRecoveryMsgCountPerReplicaPerMinute
leaderReplicaFailureCount
nonLeaderReplicaFailureCount
unknownReplicaFailureCount

```

Description of these results values are:

**TestCycles** Number of cycles for a particular test.

**OverlayNodeCount** These number of nodes will be created in Kompics Chord overlay before starting the experiment.

**ReplicationDegree** Number of RMEs in an RSM.

**TolerateFailures** This will instruct the experiment to weight for give number of failure of replicas in an RSM before deciding to migrate.

**SensorCount** Number of clients/sensors making the requests to the RSM.

**SensorStartDelayInMin** Delay for the sensors before starting the requests. Sensors should be started after enough time e.g. 60 minutes, for the system to initialize itself properly.

**SensorRequestAvgIntervalInMs** Sensor request frequency depends upon this parameter. This specifies the mean average interval between two requests of the sensor. The sensor request model is defined using life-base model with shifted pareto distribution.

**TestDurationInMin** Test Duration in Minutes. Test duration starts after the sensors start making the requests.

**nodeAverageLifeTime** This is an alpha value for *lifetime-based node failure* model [13, 30] with shifted Pareto lifetime Distribution. Used to generate Churn in the system. A zero value means no churn.

**linkLatency** Should be set to 0. 0 means the King [32] technique. Otherwise the specified value will be used as latency for every link in the system.

**seed** A random value for the initialization of the system.

**totalSensorRequest** Average Total number of request that each sensor made .

**averageRequestLatency** Average request latency of each request by each sensor.

**averageLinkDelay** Average link delay between sensor and the replica.

**averageNicheDelay** Average discovery delay for all replica failures.

**nicheMsgCountPerReplicaPerMinute** Message overhead (SMART+Paxos) per replica per minute.

**nicheEldMsgCountPerReplicaPerMinute** Message overhead (leader election) per replica per minute.

**nicheRecoveryMsgCountPerReplicaPerMinute** Message overhead (recovery messages) per replica per minute.

**leaderReplicaFailureCount** number of times the leader replica failed.

**nonLeaderReplicaFailureCount** number of times non-leader replica failed.

**unknownReplicaFailureCount** some times are replica is failed even before becoming part of any configuration. So we put that replica into this category.

A detail result of each test is also logged in file `Monitor_testId.result`.



# Appendix B

## Experiment Result Data

### B.1 Variable Replication Degree

**Fixed Test Parameters:**

Replication Degree = 500, Fault-Tolerance = 1, Sensor Count = 4, Sensor Request Frequency = 4000, Test Duration = 8 hours.

**Table columns:**

Replication Degree, Churn Rate, Total Client Requests, Avg Request Latency, Avg Discovery Delay, Avg Msg Overhead, Avg Leader Election Msg Overhead, Avg Discovery Msg Overhead, Avg Leader Replica Failure, Avg Replica Failure

1	0	29067	134.27	0	121.11	0	0	0	0
5	0	28729	276.92	0	287.3	432.49	0	0	0
10	0	28357	303.97	0	289.48	928.71	0	0	0
15	0	28612	295.44	0	294.08	1420.96	0	0	0
20	0	28407	284.56	0	292.95	1911.99	0	0	0
25	0	28654	272.31	0	296.1	2399.4	0	0	0
5	30	28548	258.09	626.73	285.27	410.45	1.99	11.9	45.2
10	30	28761	349.97	619.28	297.17	849	5.53	10.15	97.85
15	30	28864	298.94	465.96	301.14	1207.29	6.05	10.43	138.43
20	30	28649	363.11	530.36	309.99	1621.92	9.53	8.64	194.82
25	30	28761	380.41	451.87	320.46	1975.36	11.07	13.25	236.85

5	90	28801	264.11	616.96	288.72	427.06	0.81	6.67	20.67
10	90	28773	339.12	560.82	294.96	881.63	2.04	4.79	46.43
15	90	28589	306.34	435.02	299.38	1356.73	2.65	4.64	70.86
20	90	28874	319.9	478.15	309.84	1842.23	4.5	6.21	97.43
25	90	28801	283.09	397.43	314.9	2268.62	4.95	5.27	122.88
5	150	28528	256.04	666.33	286.36	434.09	0.52	3.29	13.36
10	150	28529	299.67	628.73	293.34	911.23	1.96	3.21	31.71
15	150	28523	272.06	437.79	298.26	1385.97	1.86	4.21	51.5
20	150	28362	284.76	486.28	302.39	1876.76	3.09	3	71.79
25	150	28531	306.95	394.85	307.99	2342.49	3.11	3.92	81.15



