

**NEIGHBOUR R NEIGHBOUR REPLICA AFFIRMATIVE ADAPTIVE
FAILURE DETECTION AND AUTONOMOUS RECOVERY**

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ABSTRACT

High availability is an important property for current distributed systems. The trends of current distributed systems such as grid computing and cloud computing are the delivery of computing as a service rather than a product. Thus, current distributed systems rely more on the highly available systems. The potential to fail-stop failure in distributed computing systems is a significant disruptive factor for high availability distributed system. Hence, a new failure detection approach in a distributed system called Affirmative Adaptive Failure Detection (AAFD) is introduced. AAFD utilises heartbeat for node monitoring. Subsequently, Neighbour Replica Failure Recovery(NRFR) is proposed for autonomous recovery in distributed systems. AAFD can be classified as an adaptive failure detector, since it can adapt to the unpredictable network conditions and CPU loads. NRFR utilises the advantages of the neighbour replica distributed technique (NRDT) and combines with weighted priority selection in order to achieve high availability, since automatic failure recovery through continuous monitoring approach is essential in current high availability distributed system. The environment is continuously monitored by AAFD while auto-reconfiguring environment for automating failure recovery is managed by NRFR. The NRFR and AAFD are evaluated through virtualisation implementation. The results showed that the AAFD is 30% better than other detection techniques. While for recovery performance, the NRFR outperformed the others only with an exception to recovery in two distributed technique (TRDT). Subsequently, a realistic logical structure is modelled in complex and interdependent distributed environment for NRDT and TRDT. The model prediction showed that NRDT availability is 38.8% better than TRDT. Thus, the model proved that NRDT is the ideal replication environment for practical failure recovery in complex distributed systems. Hence, with the ability to minimise the Mean Time To Repair (MTTR) significantly and maximise Mean Time Between Failure (MTBF), this research has accomplished the goal to provide high availability self sustainable distributed system.

ABSTRAK

Kebolehsediaan yang tinggi ialah satu ciri penting untuk sistem teragih semasa. Kecenderungan sistem-sistem teragih masakini seperti *grid computing* dan *cloud computing* ialah penyediaan pengkomputeran sebagai satu perkhidmatan berbanding sebagai satu produk. Oleh itu, sistem teragih semasa sangat memerlukan sistem yang mempunyai kebolehsediaan yang tinggi. Potensi untuk gagal-berhenti dalam sistem pengkomputeran teragih adalah faktor yang menyebabkan gangguan kepada kebolehsediaan yang tinggi. Oleh itu, tesis ini mencadangkan pengesanan kegagalan yang afirmatif serta adaptif (AAFD). AAFD menggunakan *heartbeat* untuk pemantauan nod. Seterusnya pemulihan kegagalan replika kejuranan (NRFR) dicadangkan untuk pemulihan secara autonomi. Oleh kerana AAFD dapat mengadaptasi dengan ketidaktentuan rangkaian dan CPU, ia boleh diklasifikasikan sebagai pengesanan kegagalan yang adaptif. NRFR menggunakan kelebihan teknik replika kejuranan teragih (NRDT) dan menggabungkan pemilihan keutamaan berdasarkan pemberat. Seterusnya AAFD dan NRFR dinilai melalui pelaksanaan *virtualisation*. Hasil keputusan menunjukkan, secara puratanya AAFD adalah 30% lebih baik dari teknik-teknik yang lain. Manakala bagi prestasi pemulihan, NRFR mengatasi yang lain kecuali untuk pemulihan didalam teknik replika berdua (TRDT). Seterusnya, struktur logik yang realistik dan praktikal bagi kebolehsediaan tinggi dalam persekitaran teragih yang kompleks dan saling bergantung dimodelkan untuk NRDT dan TRDT. Model ini membuktikan bahawa kebolehsediaan NRDT adalah 38.8% lebih baik. Oleh yang demikian, model ini membuktikan NRDT adalah pilihan terbaik untuk memulihkan kegagalan di dalam sistem teragih yang kompleks. Oleh itu, dengan kebolehan meminimumkan Mean Time To Repair (MTTR) dan memaksimumkan Mean Time Between Failure (MTBF), kajian ini mencapai matlamat untuk menyediakan sistem teragih yang mampan dan kebolehsediaan tinggi.

PUBLICATIONS

- 1) Ahmad Shukri Mohd Noor , Mustafa Mat Deris and Tutut Herawan Neighbour-Replica Distribution Technique Availability Prediction in Distributed Interdependent Environment. International Journal of Cloud Applications and Computing (IJCAC) 2(3), 98-109, IGI Global , 2012
- 2) Ahmad Shukri Mohd Noor, Mustafa Mat Deris, Tutut Herawan and Mohamad Nor Hassan. On Affirmative Adaptive Failure Detection. LNCS 7440 pp. 120-129 Springer-Verlag Berlin Heidelberg 2012.
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- 4) Ahmad Shukri Mohd Noor and Mustafa Mat Deris. Deris Failure Recovery Mechanism in Neighbor Replica Distribution Architecture. LNCS 6377, pp. 41–48, 2010. Springer-Verlag Berlin Heidelberg 2010.
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LIST OF SYMBOLS AND ABBREVIATIONS

| | | |
|-------------|---|---|
| <i>AAFD</i> | - | Affirmative Adaptive Failure Detection |
| <i>CH</i> | - | Cluster Head |
| <i>CPU</i> | - | Centre Processing Unit |
| <i>DC</i> | - | Data Collector |
| <i>FTP</i> | - | File Transfer Protocol |
| <i>GHM</i> | - | Globus Heartbeat Monitor |
| <i>HB</i> | - | Heartbeat |
| <i>HBM</i> | - | Heartbeat Monitor |
| <i>IS</i> | - | Index Server |
| <i>MTBF</i> | - | Mean Time Between Failures |
| <i>MTTF</i> | - | Mean Time To Failure |
| <i>MTTR</i> | - | Mean Time To Repair |
| <i>NRDT</i> | - | Neighbour Replication Distributed Technique |
| <i>OS</i> | - | Operating Systems |
| <i>ROWA</i> | - | Read-One Write-All |
| <i>SLAs</i> | - | Service Level Agreements |
| <i>SPOF</i> | - | Single Point Of Failure |
| <i>SSH</i> | - | Secure shell protocol |
| <i>TRDT</i> | - | Two-Replica Distributed Technique |
| <i>TQ</i> | - | Tree Quorum |
| <i>VT</i> | - | Voting |

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CHAPTER 1

INTRODUCTION

In this chapter, the background of the research is outlined, followed by problem statements, objectives, contributions, scope of the research and lastly, the organization of the thesis.

1.1 Research background

Availability is one of the most important issues in distributed systems (Renesse & Guerraoui, 2010; Deris *et al.*, 2008; Bora, 2006). With greater numbers of computers working together, the possibility that a single computer failure can significantly disrupt the system is decreased (Dabrowski, 2009). One of the benefits of a distributed system is the increase of parallelism for replication (Renesse & Guerraoui, 2010). Replication is a fundamental technique to achieve high availability in distributed and dynamic environments by masking errors in the replicated component (Noor & Deris, 2010; Bora, 2006). Thus, replication is very important in providing high availability and efficient distributed system. Distributed systems can therefore lend themselves in providing high availability (Mamat *et al.*, 2006).

A fail-stop system is one that does not produce any data once it has failed. It immediately stops sending any events or messages and does not respond to any messages (Arshad, 2006). This type of failures is common in today's large computing systems. When a fail-stop failure occurs, a prompt and accurate failure detection with minimum time to recover are critical factors in providing high availability in distributed systems. If these factors can efficiently and effectively be handled by a

failure detection and recovery technique, it can provide a theoretical and practical high availability solution for a distributed system.

Since current distributed computing such as grid computing and cloud computing become larger, increasingly dynamic and heterogeneous. These distributed systems become more and more complicated. Failures or errors are arising due to the inherently unreliable nature of the distributed environment include hardware failures, software errors and other sources of failures. Many failure detection and recovery techniques have been adopted to improve the distributed system availability. In addition to the outstanding replication technique for high availability, failure detection and recovery is an important design consideration for providing high availability in distributed systems (Dabrowski, 2009; Stelling *et al.*, 1998; Abawajy, 2004b; Flavio, 2006).

Therefore, failure detection and recovery in distributed computing has become an active research area (Dimitrova & Finkbeiner, 2009; Siva & Babu 2010; Khan, Qureshi & Nazir, 2010; Montes, Sánchez & Pérez, 2010; Costan *et al.*, 2010). Research in failure detection and recovery distributed computing aims at making distributed systems high availability by handling faults in complex computing environments. In order to achieve high availability, an autonomous failure detection and recovery service need to be adopted. An autonomous failure detection and recovery service is able to detect errors and recover the system without the participation of any external agents, such as human. It can be restored, or has the ability of self-healing, then back to the correct state again (Arshad, 2006). If no failure detection and recovery is provided, the system cannot survive to continue when one or several processes fail, and the whole program crashes.

Failure detection (or fault detection) is the first essential phase for developing any fault tolerance mechanism or failure recovery (Avizienis *et al.*, 2004). Failure detections provide information on faults of the components of these systems (Stalin *et al.*, 1998).

Failure recovery is the second phase in developing any recovery mechanism (Avizienis *et al.*, 2004). Replication is one of the core techniques that can be utilised for failure recovery in distributed and dynamic environments (Bora, 2006). Exploitation of component redundancy is the basis for recovery in distributed systems. A distributed system is a set of cooperating objects, where an object could be a virtual node, a process, a variable, an object as in object-oriented programming,

or even an agent in multi-agent systems. When an object is replicated, the application has several identical copies of the object also known as replicas (Helal, Heddaya & Bhargava, 1996; Deris *et al.*, 2008). When a failure occurs on a replica, the failure is masked by its other replicas, therefore availability is ensured in spite of the failure. Replication mechanisms have been successfully applied in distributed applications. However, the type of replication mechanisms to be used in the application is decided by the programmer before the application starts. As a result, it can only be applied statically. Thus, the development of autonomous failure detection and recovery model with suitable replication technique and architectural design strategy is very significant in building high availability distributed systems.

1.2 Problem statements

A study has found fault-detection latencies covered from 55% to 80% of non-functional periods (Dabrowski *et al.*, 2003). This depends on system architecture and assumptions about fault characteristics of components. These non-functional periods happened when a system is uninformed of a failure (or failure detection latency) and periods when a system attempts to recover from a failure (failure-recovery latency) (Mills *et al.*, 2004). Even though the development of fault detection mechanism in large scale distributed system is subject to active research, it still suffers from some weaknesses (Dabrowski, 2009; Pasin, Fontaine & Bouchenak, 2008; Flavio, 2006).

- i) Failure detection trade-offs between accuracy and completeness. Current failure detection approaches suffer from the weaknesses of either fast detection with low accuracy or completeness in detecting failures with a lengthy timeout. Inaccurate detection may result in the recovery malfunction while delays in detecting a failure will subsequently delay the recovery action. These trade-offs need to be improved.
- ii) Choosing the right replication architectural design strategies are very crucial in providing high availability and efficient distributed system. This is because keeping all of the replicas requires extra communication as well as processing and may delay the recovery process. This will cause the system to be down for a considerable period of time. In contrast, insufficient replicas can jeopardise the availability of the distributed system.

- iii) Although the idea and theory of replication is convincing and robust, practical implementation of replication technique is difficult to be modelled in real distributed environment (Christensen, 2006). This is due to the complexity in the implementation of replication and check pointing techniques. Therefore they have been studied more theoretically through the use of simulation technique (Khan, Qureshi & Nazir, 2010). Thus, most of them only discussed the simulation of the theories rather than its implementation.
- iv) Many existing failure recovery techniques have a considerable period of downtime associated with them. This downtime can cause a significant business impact in terms of opportunity loss, administrative loss and loss of ongoing business. There is a need not just to reduce the downtime in the failure recovery process but also to automate it to a significant degree in order to avoid errors that are caused by manual failure recovery techniques.

1.3 Objectives

The main objectives of this dissertation can be summarized as follows:

- i) To propose new approaches for failure detection and an autonomous failure recovery in distributed system by introducing;
 - A new framework for continuous failure detection,
 - A new framework for automated failure recovery
- ii) To implement failure detection and autonomous failure recovery based on the proposed approach.
- iii) To compare and analyse the performance of the proposed method with existing approaches.

1.4 Scope

The focus of this research is to continuously monitor the failure detection and to automate the failure recovery in an unpredictable network within Neighbour Replica Distributed environment with the assumption that failure model is fail-stop failure.

1.5 Contributions

There are four major contributions in this thesis;

- i) Introduced new continuous failure detection approach. The approaches have improved the detection accuracy and completeness as well as reducing detection time.
- ii) Proposed an autonomous failure recovery approach in a neighbour replica distributed system that can reduce computation time for failure recovery. The failure recovery approach also has the capability to determine and select the neighbour with the best optimal resources which can optimise the system availability.
- iii) The implementation of continuous failure detection and autonomous failure recovery frameworks using Linux Shell script and tools in the neighbour replica distributed system. The implementation results showed that affirmative adaptive failure detection (AAFD) is able to achieve a complete and accurate detection with prompt timing while neighbour replica failure recovery NRFR can minimise the recovery time. Hence, by reducing failure detection latency and recovery processing time, the proposed approaches are able to reduce the Mean Time To Repair (MTTR) significantly as well as maximise the system availability or Mean Time Between Failure (MTBF). In addition, the implementation demonstrated that the proposed failure detection and recovery is theoretically sound as well as practically feasible in providing high availability distributed system.
- iv) Modelled a realistic and practical logical structure for high availability in complex and interdependent distributed environment. This model provided availability predictions for neighbour replica distribution technique (NRDT) and two replica distribution technique (TRDT).

1.6 Thesis organisation.

The work presented in this dissertation is organized into six chapters. The rest of this document is organized as follows. Chapter two describes preliminary concepts and related works that are selected from related research. Chapter three proposed a

methodology for failure detection and failure recover in neighbour replica distributed architecture. This chapter discusses in detail the proposed methodology. The implementation of proposed failure detection and recovery is presented in Chapter four. Chapter five presents the results and analysis of the proposed approach implementation and provide in-depth discussion of the implementation results. Lastly, Chapter six describes the conclusions and possible future work in relation to this dissertation.

CHAPTER 2

LITERATURE REVIEW

This chapter describes related background knowledge and reviews existing literature on failure detection and recovery. The background knowledge would provide the information on failure detection metrics, the behaviour of failed systems and interaction policies. Furthermore, this chapter also discusses and reviews existing related researches on failure recovery in distributed system which includes, check-pointing and replication techniques. Since one of the objectives of this thesis is to automate failure recovery, this chapter will provide detailed review of replication techniques that best suited the high availability distributed system with self recovery characteristics. This includes the costs of resources and communication for replication as well as architectural complexity which will affect the recovery time. It also highlights the advantages and disadvantages of recent work that have been done in these fields.

2.1 Introduction

Schmidt (2006) defined availability as the frequency or duration in which a service or a system component is available for use. If this component is needed to provide the service, outage of a component is also applicable for service availability. In addition, any features that could help the system to stay operational despite the occurrences of failures will also be considered as availability.

The base availability measurement is the ratio of uptime to total elapsed time (Schmidt, 2006):

$$\text{Availability} = \frac{\text{Operational}}{\text{Operational} + \text{Non-Operational}} \quad (2.1)$$

2.2 Availability and unavailability

In availability engineering and availability studies, unavailability values are generally used as compared to the availability values. According to ITEM Software Inc. (2007), unavailability or $Q(t)$, is the probability that the component or system is not operating at time t , given that it was operating at time zero. Conversely, availability, $A(t)$, represents the probability that the component or system is operating at time t , given that it was operating at time zero. Both $Q(t)$ and $A(t)$ has a numerical values from 0 to 1 and has no units (ITEM Software Inc, 2007). The unavailability, $Q(t)$ can also be defined as the component or system probability is in the non-functional state at time t and is equal to the number of the non-functional components at time t divided by the total sample. Since a component or system must be either in the operating or non-operating state at any time, the following relationship holds true:

$$A(t) + Q(t) = 1 \text{ or Unavailability } Q(t) = 1 - A(t) \quad (2.2)$$

In this relation, the probability of availability with the absent of unavailability can be calculated. Both parameters can be used in availability assessments, safety and cost related studies.

2.2.1 Probability of availability

The goal of failure detection and failure recovery study is to reduce the sudden unavailability so that computer systems can improve availability.

Based on equation 2.1, the probability of availability can be expressed as

$$\text{Availability} = \frac{\text{MTBF}}{\text{MTBF} + \text{MTTR}} \quad (2.3)$$

Availability of a system can also be referred to as the probability that a system will be available over a time interval T (Jia & Zhou, 2005). In other words, availability is a conditional probability that a system survives for the time interval $[0, t]$, given that it was operational at time $t=0$. That is, the availability A of a system is a function of time, t , as given in the following equation.

$$A(t) = Pr\{0 \text{ failures in } [0, t] \mid \text{no failure at } t = 0\} \quad (2.4)$$

Jia & Zhou (2005) have also expressed availability in terms of operational and failure nodes. Equation 2.5 gives the value of $A(t)$ where $N_o(t)$ represents the number of nodes that are operating correctly at time t , $N_f(t)$ the number of nodes that have failed at time t , and N be the number of nodes that are in operation at time t .

$$A(t) = \frac{N_o(t)}{N} = \frac{N_o(t)}{N_o(t) + N_f(t)} \quad (2.5)$$

Similarly, unavailability, (Q) is defined by Jia & Zhou (2005) as:

$$Q(t) = \frac{N_f(t)}{N} = \frac{N_f(t)}{N_o(t) + N_f(t)} \quad (2.6)$$

2.2.2 Mean Time Between Failures (MTBF)

Reliability of repairable items can be measured using Mean Time Between Failures (MTBF). MTBF basically refers to the amount of time passed before a component, assembly, or system fails, when subjected to constant failure rate. Or it is simply the expected value of time between two consecutive failures. For constant failure rate systems, MTBF can also be calculated as the inverse of the failure rate, λ .

2.2.3 Mean Time To Failure (MTTF)

Mean Time To Failure (MTTF) on the other hand is used to measure the reliability of non-repairable systems (ITEM Software Inc, 2007). It represents the expected mean time before the occurrence of the first failure. For constant failure rate systems, MTTF is the inverse of the failure rate λ . If failure rate λ , is in failures/million hours, $MTTF = 1,000,000 / \text{Failure Rate, } \lambda$, or;

$$MTTF = \frac{1}{\lambda \text{ failures} / 10^6 \text{ hours}} \quad (2.7)$$

Typically, MTBF is applicable to components that could be repaired and returned to service whereas MTTF applies to parts that would no longer be used upon failure. However, MTBF can also be used for both repairable and non-repairable items. According to the European Power Supply Manufacturers Association (2005), MTBF refers to the time until the first (an only) failure after t_0 .

2.2.4 Mean Time to Repair (MTTR)

Mean Time To Repair (MTTR) refers to the duration of time between failure and completion of any corrective or preventative maintenance repairs (ITEM Software Inc. 2007). The term only applies to repairable systems.

2.2.5 Failure Rates

The probability of availability is based on failure rates. Every product has a failure rate, λ which is the number of units failing per unit time. Conditional Failure Rate or Failure Intensity, $\lambda(t)$, on the other hands provides a measure of reliability for a product. ITEM Software Inc. (2007) defined $\lambda(t)$, as the expected number of times an item will fail in a specified time period, given that it was as good at time zero and is working at time t. A failure rate of 0.2%/1000 hours or 2 failures per million hours (*fpmh*) or 500,000 hours/failure can be expressed as:

$$\frac{0.2}{100} * \frac{1}{1000} = \frac{2}{10^6} = 2 \text{ fpmh} \quad (2.8)$$

By considering a node with 0.2% of failure per 1000 hours, the probability of failures, $Q(t)$, (sudden unavailability) per year could be calculated as:

$$\frac{0.2}{100} * \frac{1}{1000} * 24 * 365 = 0.01752,$$

Since availability is given by $A(t) = 1 - Q(t)$, therefore $A(t) = 1 - 0.01752 = 0.98248$.

If in three year, the unavailability is;

$$Q(t) = \frac{0.2}{100} * \frac{1}{1000} * 24 * 365 * 3 = 0.05256 \quad (2.9)$$

Thus, the availability for three year is;

$$A(t) = 1 - Q(t) = 1 - 0.05276 = 0.94724 \quad (2.10)$$

Based on this equation, it can be calculated that in 3 years (26,280 hours) the availability, $A(t)$ is approximately 0.95. This means that if such a unit is operational 24 hours a day for 3 years, the probability of it surviving that time is about 95%. The same calculation for a ten year period will give $A(t)$ a value of about 84%.

2.2.6 System availability

System availability is calculated by structuring the system as an interconnection of parts in series and parallel. In order to decide if components should be placed in series or parallel, Pre (2008) applies the following rules:

- i) The two parts are considered to be operating in series if failure of a part leads to the combination becoming inoperable.
- ii) The two parts are considered to be operating in parallel if failure of a part leads to the other part taking over the operations of the failed part.

2.2.6.1 Availability in series

Two parts, x and y are considered to be operating in series if failure of either of the parts results in failure of the combination. For this combined system, it is only available if both Part X and Part Y works.

Hence, the serial availability of the combined system is given by the product of the two parts as shown in the following equation (Pre, 2008):

$$A = A_x * A_y \quad (2.11)$$

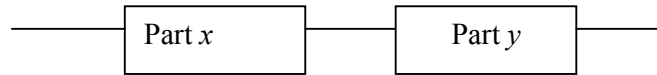


Figure 2.1: Availability in series

Based on the above equation, the combined serial availability of two components is always lower than the availability of its individual components.

2.2.6.2 Availability in parallel

Two parts, x and y , are considered to be operating in parallel if either part is available. Only when both parts fail, the combination is considered failed. Hence, this combination enables the design of a high availability system which makes it suitable for mission critical systems. Equation 2.12 gives the availability for parallel systems (Pre, 2008):

$$A = 1 - (1 - A_x)(1 - A_y) \quad (2.12)$$

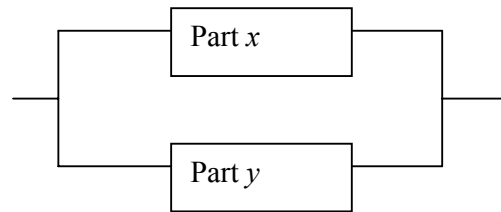


Figure 2.2: Availability in parallel

2.2.6.3 Availability in joint parallel and series environment

In real environment, however, it is common to have two or more sets of parallel components connected in series. If this is the case, the availability A can be defined as:

$$A = (1 - (1 - A_w)(1 - A_x)) * ((1 - (1 - A_y)(1 - A_z)) \quad (2.13)$$

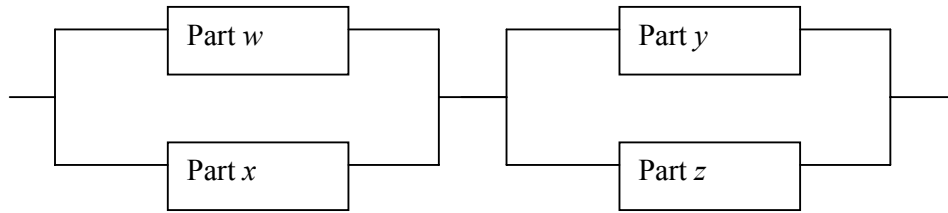


Figure 2.3: Availability in joint parallel with series

2.2.7 Availability in distributed system

Data availability in parallel distributed systems could be improved by storing multiple copies of data at different sites. With this redundancy, data could be made available to users despite site and communication failures. In the parallel distributed system, the system works unless all nodes fail. Connecting machines in parallel contribute to the system redundancy reliability enhancement.

Let A = availability, Q = unavailability, then the system unavailability as given by Koren and Krihna (2007) is as follow:

$$Q = Q_1 * Q_2 * Q_3 * \dots * Q_n$$

$$Q = (1 - A_1) * (1 - A_2) * (1 - A_3) * (1 - A_n) \quad (2.14)$$

Thus, the availability of the distributed parallel system can be calculated as:

$$A_S = 1 - Q_S = 1 - (Q_1 * Q_2 * Q_3 * \dots * Q_n)$$

$$= 1 - [(1 - A_1) * (1 - A_2) * \dots * (1 - A_n)] \quad (2.15)$$

$$= 1 - \prod_{i=1}^n (1 - A_i)$$

To illustrate this, let us take a system that consists of three nodes connected in parallel. The availability of these nodes are 0.9, 0.95 and 0.98 respectively. The overall system availability is given by:

$$A = 1 - (1 - 0.9) * (1 - 0.95) * (1 - 0.98) = 1 - 0.1 * 0.05 * 0.02 = 1 - 0.0001 \quad (2.16)$$

$$A = 0.99990$$

2.2.8 The k-out-of-n availability model in distributed system

A k -out-of- n configuration refers to independent nodes that have some identical data or services (Koren & Krihna, 2007). Based on this configuration, failure of any nodes would not affect the remaining nodes and all nodes have the same failure distribution. The availability of each node could be evaluated using the binomial distribution, or:

$$R_S(k, n, R) = \sum_{r=k}^n \binom{n}{r} R^r (1-R)^{n-r} \quad (2.17)$$

Where,

- n is the total number of units in distributed parallel.
- k is the minimum number of units required for system success.
- R is the reliability of each unit.

2.3 Terminology

Flavio (2006) described a fault as either software or a hardware defect. An error is an incorrect step, process, or data definition. A failure is a deviation from the expected correct behaviour. As an example, if a programmer introduces an invalid set of instructions, and the execution of these instructions causes a computer to crash, then the introduction of these instructions into the program is the fault, executing them is the error, and crashing the computer is the failure.

The following terms are mostly based on the book published by IBM entitled “Achieving High Availability on Linux for System Z with Linux-HA Release 2” by Parziale *et al.*, (2009).

i) High availability

High availability is the maximum uptime of a system. A system that is developed to be high availability resists failures that are caused by planned or unplanned outages. The terms stated in Service level agreements (SLAs) decide the degree of a system’s high availability.

- ii) **Continuous operation**

Continuous operation is an uninterrupted or non-disruptive level of operation where changes to hardware and software are apparent to users. Planned outages normally take place in environments that are designed to provide continuous operation. These kinds of environments are designed to avoid unplanned outages.
- iii) **Continuous availability**

Continuous availability is an uninterrupted, non-disruptive, level of service that is provided to users. It provides the highest level of availability that can possibly be achieved. Planned or unplanned outages of hardware or software cannot exist in environments that are designed to provide continuous availability.
- iv) **Failover**

Failover is the procedure in which one or more node resources are transferred to another nodes or nodes in the same cluster because of failure or maintenance.
- v) **Failback**

Failback is the procedure in which one or more resources of a non-functional node are returned to its original owner once it becomes available.
- vi) **Primary (active) node**

A principal or main node is a member of a cluster, which holds the cluster resources and runs processes against those resources. When the node is conciliated, the ownership of these resources stops and is passed to the standby node.
- vii) **Standby (secondary, passive, or failover) node**

A standby node, also known as a passive, secondary or failover node is a member of a distributed system that is able to access resources and running processes. However, it is in a standby position until the principal node is conciliated or has to be stopped. At that point, all resources fail over to the standby node, which becomes the active node.
- viii) **Single point of failure**

A single point of failure (SPOF) exists when a hardware or software component of a system can potentially bring down the entire system without

any means of quick recovery. High availability systems tend to avoid a single point of failure by using redundancy in every operation.

ix) Cluster

A cluster is a group of nodes and resources that act as one entity to enable high availability or load balancing capabilities.

x) Outage

For the intention of this thesis, outage is the failure of services or applications for a particular period of time. An outage can be planned or unplanned:

- Planned outage

Planned outage takes place when services or applications are interrupted because of planned maintenance or changes, which are expected to be reinstated at a specific time.

- Unplanned outage

Unplanned outage takes place when services or applications are interrupted because of events that are out of control such as natural disasters. Unplanned outages can also be caused by human errors and hardware or software failures.

xi) Uptime

Uptime is the duration of time when applications or services are available.

xii) Downtime

Downtime is the duration of time when services or applications are not available. It is usually calculated from the time that the outage takes place to the time when the services or applications are available.

xiii) Service level agreement

Service Level Agreements (SLAs) ascertain the degree of responsibility to maintain services that are available to users, costs, resources, and the complexity of the services. For example, a banking application that handles stock trading must maintain the highest degree of availability during active stock trading hours. If the application goes down, users are directly affected and, as a result, the business suffers. The degree of responsibility varies depending on the needs of the user.

2.4 Failure detection

Failure detection is a process in which information about faulty nodes is collected (Siva & Babu, 2010). This process involves isolation and identification of a fault to enable proper recovery actions to be initiated. It is an important part of failure recovery in distributed systems.

Chandra & Toueg (1996) characterize failure detectors by specifying their completeness and accuracy properties (Elhadef & Boukerche, 2007). The completeness of a failure detector refers to its capability of suspecting every faulty node permanently. While, the accuracy refers to its capability of not suspecting fault-free ones.

Stelling *et al.* (1999) considered the main concerns or requirements that should be addressed in designing a fault detector for grid environments. These include:

- i) Accuracy and completeness. The fault detector must identify faults accurately, with both false positives and false negatives being rare.
- ii) Timeliness. Problems must be identified in a timely manner in order for responses and corrective actions to be initiated as soon as possible.

Chen *et al.* (2000) analysed the quality of service (QoS) of failure detectors and proposed that the measurement of QoS should adhere to the following metrics:

- i) Detection time (TD): TD is the time that passes from q 's crash to the time when q starts to suspect p permanently.
- ii) Mistake recurrence time (TMR): The mistake recurrence is the time between false detections.

In order to formally classify the QoS metrics, Chen *et al.* (2000) identified state transitions of a failure detector as “when a failure detector monitors a monitored process, at any time, the failure detector’s state either trusts or suspects the monitored process’s liveness. If a failure detector transfers from a trust state to a suspect state, then an S-transition occurs, if a failure detector transfers from a Suspect state to a Trust state then a T-transition occurs”. Ma (2007) recommended a set of QoS metrics to measure the completeness, accuracy and speed of unreliable failure detectors. QoS in this context means measures that indicate (1) how fast a failure detector detects actual failures, and (2) how well it avoids false detections.

2.5 Behaviour of failed systems

In distributed systems, failures do occur. The types of failures can cause the system to behave in a certain way. While there are slight discrepancies in literature regarding their definitions (Satzger *et al.*, 2008), Arshad (2006) classifies possible behaviour of systems following a failure into three types which are:

- i) A crash-recovery failure model is a fail-stop failure in which once it has failed, it would not be able to output any action or trigger any events.
- ii) A byzantine system is one that does not stop after a failure but instead behaves in an inconsistent way. It may send out wrong information, or respond late to a message.
- iii) A fail-fast system is one that behaves like a Byzantine system for some time but moves into a fail-stop mode after a short period of time.

This thesis focuses on distributed system components or nodes that have fail-stop behaviour. It does not matter what type of faults or failures that have caused this behaviour but it is necessary that the system does not perform any operation once it has failed. In other words it just stops doing anything following a failure.

2.6 Interaction policies

The failure detectors and the monitored components commonly communicate through either two interaction protocols. One is the heartbeat model and the other is the pull or ping model. These behaviours of monitoring protocols are used by failure detector to monitor system components (Felber *et al.*, 1999).

2.6.1 The Heartbeat model

The heartbeat model or push model is the most common technique for monitoring crash failure (Mou, 2009). Many state-of-the-art failure detector approaches were based on heartbeats (Hayashibara & Takizawa 2006; Satzger *et al.*, 2007; Satzger *et al.*, 2008; Dobre *et al.*, 2009; Noor & Deris, 2009).

In the push model, the direction of control flow matches the direction of information flow. In addition, the model has active monitorable objects. These

objects will periodically send heartbeat messages to inform other objects that they are still alive. If no heartbeat is received by the monitor within specific time bounds, it starts suspecting the object. Since only one-way messages are sent in the system, this method is efficient. If several monitors are monitoring the same objects, the model may be implemented with hardware multicast facilities.

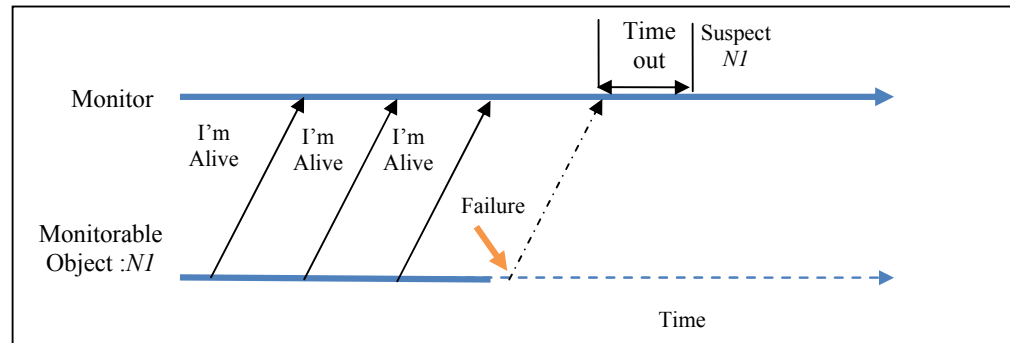


Figure 2.4: The Heartbeat model for object monitoring

Figure 2.4 illustrates the monitoring objects of the heartbeat model (Felber *et al.*, 1999). The abstraction of the roles of objects involved in a monitoring system is performed by three interfaces namely monitors, monitorable objects and notifiable objects. Monitors (or failure detectors) basically collect information about component failures. Objects that may be monitored hence enable failures to be detected are termed as Monitorable objects. Notifiable objects refer to objects that can be registered and asynchronously notified by the monitoring service about object failures.

2.6.2 The Pull model

In the pull model which is also known as ping model, the flow of information is in the opposite direction of control flow, i.e., only when requested by consumers. If compared with the push model, monitored objects in this model are passive. The monitors periodically send liveness requests to check the status of the monitored objects. If a monitored object replies, it means that it is alive. Since two-way messages are sent to monitored objects, this model is normally regarded as less efficient and less popular than the push model. However, the pull model is easier to use because the monitorable objects are passive and do not have to know the

frequency at which the monitor expects to receive messages. Figure 2.5 illustrates how the pull model is used for monitoring objects and the messages exchanged between the monitor and the monitorable object (Felber *et al.*, 1999).

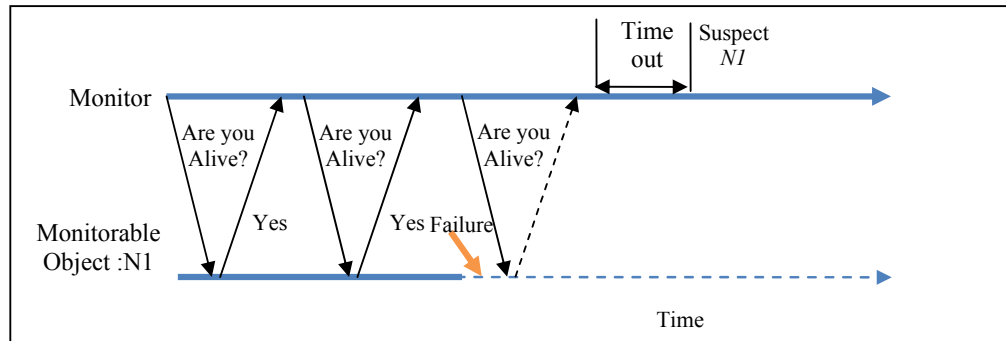


Figure 2.5: The Pull model for object monitoring

2.7 Existing failure detection techniques

Failure detection techniques in distributed systems have received much attention by many researchers. There were many failure detection protocols or techniques that have been proposed and implemented. Most of these implementations were based on timeouts.

2.7.1 Globus Heartbeat monitor

Stelling *et al.*, (1999) proposed Globus Heartbeat Monitor (GHM) for a failure detection service in grid computing, which have become one of the most popular fault detector services in grid environment. GHM is based on two-layer architecture: the lower layer includes local monitors and the upper layer contains data collectors. The local monitor performs two functions: (i) monitors the host on which it runs, and (ii) selects processes on that host. It periodically sends heartbeat messages to data collectors including information on the monitored components. On receiving heartbeats from local monitors, the data collectors are responsible for identifying failed components, and notifying applications about relevant events concerning monitored components. This approach improves the failure detection time in a grid.

Each local monitor in this approach broadcasts heartbeats to all data collectors. Globus toolkit has been designed to use existing fabric components, including vendor-supplied protocols and interfaces (Hayashibara & Takizawa, 2006).

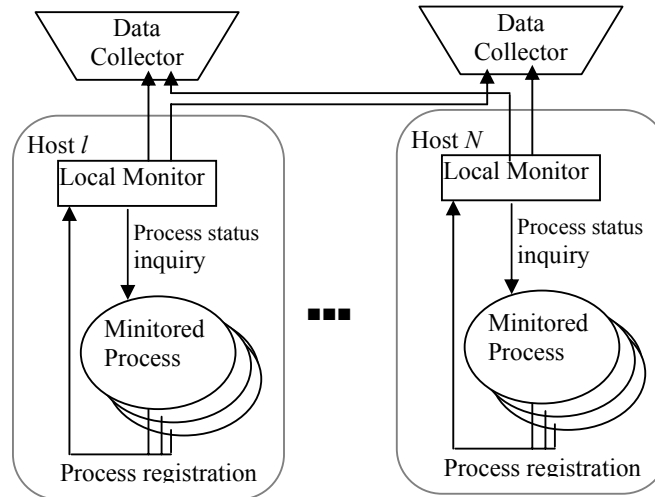


Figure 2.6: The architecture of the GHM failure detection (Stelling *et al.*, 1999)

The architecture of the GHM failure detection service grid shown in Figure 2.6 may change its topology by component leaving/joining at runtime but the proposed architecture is static and does not adapt well to such changes in a system topology. Recently, International Business Machines (IBM) (Parziale *et al.*, 2009) have utilised the Heartbeat Release 2 (released in 2005) in achieving high availability on Linux for IBM System Z. This heartbeat is able to scale up to 16 nodes. However, the Heartbeat Release 2 still maintains the fixed interval time and timeout delay as Heartbeat Release 1. However, few bottlenecks have been identified as put by Abawajy (2004b) “they scale badly in that the number of members that are being monitored require developers to implement fault tolerance at the application level”. Pasin, Fontaine and Bouchen (2008) also found that they are difficult to implement and have high-overhead.

Failure Detection and Recovery Services (FDS) improves the GHM with early detection of failures in applications, grid middleware and grid resources (Abawajy, 2004b). The classical heartbeat approach suffers from two main weaknesses;

- i) The detection time depends on the last heartbeat.

- ii) It relies on a fixed timeout delay that does not take into account the network and system's load.

The first weakness may have a negative impact on the accuracy of the failure detector since premature timeouts may occur. For the second weakness, a node may be mistakenly suspected as faulty if it slows down due to heavy workload or if the network suffers from links failure that may delay the delivery of messages.

2.7.2 Scalable failure detection

Gillen *et al.* (2007) have designed an adaptive version of the Node-Failure Detection NFD subsystem. In this version, the failure-detection thresholds used by individual Monitors are increasingly adjusted on a per-node basis. A simplistic approach was used to monitor adaptation. Every time the monitor detected a false positive on that node, the Monitor's detection threshold, T_h for a node is multiplied by a configurable value, k . In the implementation, they set the value of threshold to 2 (the same value of k is used for all nodes.) $T_{h+1} = k(S_h)$. They concluded that the best way to avoid a large number of false positives caused by dropped heartbeat packets is to set T_h to be at least twice the heartbeat generation period. This enables the system to avoid declaring a false failure in the case of disjointed single-packet losses without incurring the overhead from sending more packets.

2.7.3 Adaptive failure detection

Adaptive failure detectors can adapt to change network conditions (Chen, 2002; Hayashibara *et al.*, 2004). The approaches were based on periodically sent heartbeat messages. A network can behave significantly different during high traffic times and low traffic times with respect to probability of message loss, the expected delay for message arrivals, and the variance of this delay. In order to meet the current conditions of the system, adaptive failure detectors will arrange their parameters accordingly. In this case, the parameter is the predicted arrival time of future heartbeat message. For example, the next heartbeat message will arrive within 2 seconds. Thus, this makes adaptive failure detectors highly desirable. In large scale networks, adaptive approaches were proved to be more efficient than approaches

with constant timeout (Khilar, Singh & Mahapatra, 2008; Gillen *et al.*, 2000; Satzger *et al.*, 2008).

Chen *et al.* (2002) have proposed a well-known implementation for a failure detector that adapts to changes in network conditions. It was based on a probabilistic analysis of a network traffic called adaptive failure. Adaptive failure detectors are extended implementations that adapt dynamically to their environment (i.e., network condition) and to change application behaviour. These adapters are basically implemented based on the concepts of unreliable failure detectors or the legacy timeout-based failure detection. A timeout is adjusted according to network condition and requirement from an application. This technique compute an estimation of the arrival time of the next heartbeat using arrival times sampled in the recent past. The timeout is set according to this estimation and a safety margin, and recomputed for each interval. The safety margin is set by application QoS requirements (e.g., upper bound on detection time) and network characteristics (e.g., network load). Based on data failure samples, detectors generate a suspicion value which indicates whether *a node* has failed or not. Failure detectors differ in the way the suspicion value is computed but they all are dependent on the input from the sample base.

Bertier & Marin (2002) have integrated Chen's estimation with another estimation developed by Jacobson (1998) for a different context. Their approach is similar to Chen's, however they did not use a constant safety margin but computed it with Jacobson's approach. Elhadef & Boukerch (2007) proposed a method to estimate the arrival time of the heartbeat messages where the arrival time of the next heartbeat of a node is computed by averaging the *n* last arrival times. In their implementation, Bertier's approach is improved and utilised. Process *p* manages a list *S* based on the information it receives about the inter arrival times of the heartbeats. The equation for heartbeat arrival prediction for this approach is given as:-

$$S_{n+1} = \frac{\sum_{i=1}^n S_i}{|S|} \quad (2.18)$$

where

$$S = [1.083s, 0.968s, 1.062s, 0.993s, 0.942s, 2.037s, \dots]$$

$$S_i = \{x \mid x \in S \text{ and } x \neq \emptyset\}$$

$$s_{n+1} = \text{Inter arrival time of next heartbeat message.}$$

Khilar, Singh & Mahapatra (2008) have proposed an adaptive failure detection service for large scale ad hoc networks using an efficient cluster based communication architecture. This failure detection service (after this, it is called Khilar's approach) adapted the detection parameter to the current load of the wireless ad hoc network. In this proposed approach, a heartbeat based testing mechanism is used to detect failure in each cluster and take the advantage of cluster based architecture to forward the failure report to other cluster and their respective members. In Khilar's failure detection approach, each cluster head maintains a heartbeat table received for each member node. Cluster head, CH also stores the arrival time of last n heartbeat messages for each member node. Initially, the table has a fixed timeout period for each node. When a heartbeat from a particular member is received, a new freshness point is calculated using the arrival time of this heartbeat and previous heartbeat messages and new timeout period is set to be equal to this freshness point, $S_{n+1} = S_n$ or $H_{max} = S_n$.

2.7.4 Lazy Failure Detection

Lazy Failure detection approach (Fetzer *et al.*, 2001) attempt to reduce the networking overhead that arises e.g. from sending heartbeat messages. To achieve this, detection processes monitor each other by using application messages whenever possible to get information on processor failures. This protocol requires each message to be acknowledged. Only when two processes are not communicating, then failure detection messages are used (Satzger *et al.*, 2008).

A heartbeat-style failure detector is referred to as lazy if it uses a technique to reduce the networking overhead caused by sending heartbeat messages. In other word, this approach only send heartbeat messages if it really have to and is thus called lazy. In this context, it is important to distinguish between application messages and heartbeat messages. While the former are sent by the application and unavoidable, heartbeat messages are sent by failure detectors.

Satzger *et al.* (2008) proposed a lazy monitoring approach aims at reducing the network load without the negative effects on the detection time. Quite the contrary, it allows for a better training of the failure detector as it provides more data and thus can further improve the quality of the generated suspicion information. This

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