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Fault Tolerance for Distributed Maple

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Abstract

Distributed Maple is a Java-based system for implementing in distributed environments parallel programs in the computer algebra system Maple. It has evolved from Dr. Wolfgang Schreiner's experience in the development of parallel computer algebra environments and from learning from the work of other researchers. As the problems to which the system was applied became more and more complex, the meantime between session failures became a limiting factor of the applicability of the system. However, the fact that the parallel programming model of the system is basically functional gave the chance to develop new fault tolerance mechanisms for Distributed Maple which are more effective than existing solutions targeted to general parallel applications (like checkpointing).

In this thesis, we present and describe how we have extended Distributed Maple with fault tolerance such that the time spent in a long running computation is not any more wasted by the eventual occurrence of a failure. First we introduced a mechanism for the logging of task return values and of shared object values such that after a failure a newly started session can (transparently to the application program) reuse already computed results. Then we concentrate on node failures and permanent connection failures. We implemented some new mechanisms by which a session is able to tolerate connection and node failures (even if the root node fails) without overall failure and continue normal operation. Furthermore, the system periodically attempts to restart the failed nodes and to reestablish the broken connections. Together these fault tolerance mechanisms allow to run computations that take much longer than the meantime between session failures.

With these developments, Distributed Maple is by far the most advanced system for computer algebra concerning reliability in distributed environments.

Zusammenfassung

Distributed Maple ist eine Java-basierte Software, um im Computeralgebra-System Maple parallele Programme für verteilte Umgebungen zu schreiben. Die Software wurde aus Dr. Wolfgang Schreiners Erfahrungen mit der Entwicklung paralleler Computeralgebra-Umgebungen und aus der Arbeit anderer Forscher heraus entwickelt. Als die Probleme, auf die Distributed Maple angewendet wurde, immer komplexer wurden, entwickelte sich die mittlere Zeit zwischen Systemfehlern zu einem einschränkenden Faktor bei der Anwendbarkeit der Software. Allerdings gab die Tatsache, dass das parallele Programmiermodell von Distributed Maple im wesentlichen funktional ist, die Chance, neue Mechanismen zur Fehlertoleranz zu entwickeln, die effektiver als existierende Lösungen sind, die auf allgemeine parallele Anwendungen abzielen.

In dieser Arbeit zeigen wir, wie wir Distributed Maple um Mechanismen zur Fehlertoleranz erweitert haben, sodass die Zeit, die mit langen Berechnungen verbracht wird, nicht letztendlich durch einen Programmabbruch vergeudet wird. Zuerst führen wir einen Mechanismus ein, um die Ergebniswerte von Aufgaben und die Inhalte von Objekten so zu speichern, dass nach einem Programmabbruch ein neuer Programmlauf diese Werte wieder verwenden kann, ohne sie neu zu berechnen (wobei die Anwendung keinen Unterschied merkt). Dann konzentrieren wir uns auf das Ausfälle von Knoten und Verbindungen im verteilten System. Wir haben einige Mechanismen entwickelt, mit denen solche Ausfälle (sogar der Ausfall des Zentralknotens) toleriert werden können, ohne dass das gesamte System abbricht sondern mit der Arbeit normal fortfahren kann. Weiters versucht das System periodisch, ausgefallene Knoten neu zu starten und ausgefallene Verbindungen wieder her zu stellen. Zusammen erlauben es diese Mechanismen, Berechnungen durchzuführen, die viel länger als die mittlere Zeit zwischen Systemfehlern benötigen.

Mit diesen Entwicklungen ist Distributed Maple das weitaus forgeschrittenste System für Computeralgebra, was die Zuverlässigkeit in verteilten Umgebungen betrifft.

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Chapter 1

Introduction

1.1 Goals and Motivation

During the last decade, the field of distributed computing has considerably evolved. However, as the use of distributed computing systems for long-running and large scale computations is growing, they become increasingly vulnerable to failures. Therefore, an indispensable condition for the extension of the usability of such systems is to increase their reliability. For achieving this, some *fault tolerance* mechanisms have to be adopted such that applications can withstand the number of failures before normal operation is impaired.

In this thesis, we focus on the new fault tolerance ability of Distributed Maple. This software is a Java-based system for implementing in distributed environments parallel programs in the computer algebra system Maple [58]. In contrast to systems for message-based parallel programming, Distributed Maple is fundamentally based on the concept of functional tasks that return a result and have no other side-effect. Still this model is very general, e.g., it allows tasks to start other tasks, to refer to the handlers of other tasks as arguments and to return task handlers as results (thus it supports general communication structures). A comprehensive survey on the system and its applications is given in [66].

However, as we began to attack larger and larger problems, the meantime between session failures (less than a day) became a limiting factor in the applicability of the system. We therefore started to investigate how to extend the time scale of distributed computations to many days as is required for realistic applications.

Our goal for the thesis was the following: by taking advantage of the fact that the parallel programming model of the system is basically functional, we 2 INTRODUCTION

intended to develop new fault tolerance mechanisms for Distributed Maple which are more effective than existing solutions targeted to general parallel applications. Another requirement was that the implemented fault tolerance has to be *transparent* to the application.

To achieve this goal, we invented and introduced some new fault tolerance mechanisms to Distributed Maple [64, 65, 8, 9, 10] by which the system can continue normal operation in the following failure situations: any node (be it a non-server node or be it the server itself) fails or a connection between any two nodes breaks. To cope with the possibility that the systems fails due to other reasons, another mechanism [64, 65, 8] continuously saves the intermediate computing results during the execution; thus we can restart the system and continue the computation from a saved state.

As the outcome of our work, the applicability of the system is extended by the developed fault tolerance mechanisms. This work has considerably profited from the deliberate restriction to the programming and execution model mentioned above. Thus Distributed Maple has become the most advanced system for computer algebra concerning reliability in distributed environments.

1.2 Structure and Originality of the Thesis

In the followings, we present how the rest of the thesis is organized.

Chapter 2 (State of the Art) gives a survey on the fields that are relevant to the thesis. Section 2.1 gives an overview on the use of Maple for parallel computer algebra. Section 2.2 describes ongoing work on fault tolerance in distributed systems.

Chapter 3 (Distributed Maple) gives an overview about the original Distributed Maple (without fault tolerance). Section 3.1 introduces into the usage of the system and collects the commands of the user interface. Section 3.2 gives a short overview about the system architecture and the execution model of Distributed Maple. These two sections are based on the research work of Dr. Wolfgang Schreiner. At the end of the chapter, Section 3.3 analyses the possible failure situations which may occur in Distributed Maple.

Chapter 4, Chapter 5, and Chapter 6 describe the achievements of the thesis. The explanations of the fault tolerance mechanisms in these chapters are usually divided to three parts:

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• The section "Assumptions and Guarantees" determines what kind of conditions have to be satisfied for the proper working of the mechanism and what kind of guarantees are provided by this mechanism in exchange.

- The section "Algorithm" gives a general description of the fault tolerance mechanism.
- the section "Implementation" presents how the mechanism has been implemented in Distributed Maple and lists the corresponding data structures (implemented as Java classes).

Chapter 4 (The Logging Mechanism) presents the "Logging" mechanism which we introduced to reuse already computed results after a session failure. This mechanism is explained in three stages. In Section 4.2, the basic functionalities of the "Logging" mechanism are presented (these are collectively called the Fast Mode). This "Fast Mode" was developed by the author jointly with Gábor Kusper and Dr. Schreiner. Later, it has been refined repeatedly by the author. In Section 4.3, the "Logging" mechanism is extended to the Safe Mode which allows tasks to refer each other in their descriptions and results. This Safe Mode was elaborated only by the author. Section 4.4 shows how shared objects are handled in the "Logging" mechanism. The handling of the shared object was designed and accomplished by the author together with Gábor Kusper.

Chapter 5 (Tolerating Connection Failures) deals with the tolerance of connection failures in Distributed Maple. In *Section 5.1* the "Reconnecting" and in *Section 5.2* the "Tolerating Peer Connection Failures" mechanisms are described. These two mechanisms were invented and implemented by the author.

Chapter 6 (Tolerating Node Failures) explains three mechanisms by which Distributed Maple sessions are able to tolerate node failures. All three mechanisms were discovered and implemented by the author. Section 6.1 introduces the "Tolerating Non-Root Node Failures" mechanism first by which tasks can be migrated such that a session may tolerate the failure of individual (non-root) nodes without overall failure. In Section 6.2, this mechanism is extended with the "Restarting after Node Failures" mechanism which is able to reduce the loss of resources after node failures. Section 6.3 describes the "Tolerating Root Failure" mechanism that allows the system to cope with root node failure without overall failure.

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Chapter 7 (Examples and Test Experience) collects the new Distributed Maple commands which belong to the fault tolerance features in Section 7.1 and shows by some examples in Section 7.2 and in Section 7.3 how they can be used. Then it analyses the performance of the fault tolerance mechanism in Section 7.4.

Chapter 8 (Conclusions) summarizes our results. Section 8.1 compares the fault tolerance features of Distributed Maple with a checkpointing mechanism recently developed by another group for a particular parallel programming environment. Section 8.2 outlines further development directions.

Chapter 2

State of the Art

In this section, we sketch a survey of those research areas which are relevant to the thesis.

2.1 Parallel Computer Algebra with Maple

Distributed Maple has evolved from Dr. Schreiner's experience in the development of parallel computer algebra environments and from learning from the work of other researchers. The programming interface of the system is based on a para-functional model as adopted by the PARSAC-2 system [39] for computer algebra on a shared memory multiprocessor. The model was refined in PACLIB [31] on which a para-functional language was based [57]. In the following, we give a short overview about some research which is more or less directly relevant for our work. This section is mostly epitomized from [66].

Many papers on parallel computer algebra can be found in [20, 73, 30, 29]; summaries are also available in [54] and [26].

An early approach to use Maple as an engine for parallel computer algebra was "Sugarbush" [15] that used the coordination language Linda to manage concurrent activities on multiprocessors and computer networks. The system was used e.g. for parallelizing big number arithmetic [16]; because of its special kernel it fell out of use with decline of Linda support.

Without any special parallel programming support, [71] used Maple in a workstation cluster to parallelize the characteristic set algorithm. Maple kernels were directly started on various machines and communicated by reading and writing to files in a global network file system. Because of the large process granularity, this approach nevertheless achieved good speedups.

The ||MAPLE|| ("Parallel Maple") environment [67] used the Guarded

Horn Clause language Strand for coordinating the activities of multiple Maple kernels running on multiprocessors and computer networks. Since the system depended on a special version of the Maple kernel, it could not be distributed; with the decline of Strand, it fell out of use.

[13] describes an environment where Maple computations can be distributed across a network of workstations by use of the DSC system [18] which on the basis of standard Internet services ships source code and input data to computers for execution and retrieves the produced output. The system was used with good success for the parallelization of various polynomial algorithms.

The parallel Maple system described in [6] extended the kernel by message passing primitives for the Intel Paragon distributed memory multiprocessor and provided a corresponding Maple programming interface. This framework only allowed the main program to create other tasks (no nested parallelism). The system was not distributed and is not use any more.

FoxBox [19] provides via a Maple interface access to parallel polynomial factorization algorithms implemented in C++ on top of the message passing library MPI. This is a complementary approach to Distributed Maple and the systems mentioned above, because it allows Maple to use an external parallel program but not to write a parallel program that uses Maple.

The computer algebra system "muPad" is on the surface similar to Maple. Its kernel can be dynamically extended by a package for "macro parallelism" implemented in PVM [43]. This package allows to write master-worker programs for distributed environments based on the concepts of message passing, global variables and work groups. The parallel programming model is on a considerably lower level than Distributed Maple.

PVMaple was developed for solving systems of differential equations [48]. Similar to the Intel Paragon Maple and to muPad, it provides a Maple interface for writing message passing programs. However, inspired by Distributed Maple, it uses an external process for performing the actual interprocess communication on top of PVM; Maple and this process communicate via shared files. The system runs on clusters of PCs under MS Windows.

Recently, the authors of PVMaple have produced the prototype of a grid-wrapper for Maple called Maple2g [49, 50]. Its essentially core is a proxy software that connects to the Globus middleware such that a Maple master process can use Globus to submit computational jobs to computational nodes. Maple processes may cooperate by message-passing (similar to PVMaple) on the basis of the Java-based MPI implementation mpiJava. Initial tests performed with a small number of grid nodes indicate that reasonable efficiency can be obtained in such scenarios. However, it was also found that local cluster computations based on native MPI tools for communication were

substantially faster than grid-based computations using the Globus-based counterparts. Maple2g is restricted to one-level master-slave relationships between nodes; it is planned to generalize these relationships to allow hierarchical grid-based applications.

2.2 Fault Tolerance in Distributed Systems

2.2.1 Failure Detection in Asynchronous Distributed Systems

In practice, one of the major differences between distributed and sequential systems is that in a distributed session, there may be possibilities to avoid overall failure and to continue the entire computation even if some individual components fail. In our days, the field of fault detection and recovery techniques is a very complex and crucial area of distributed computing. Unfortunately, the capabilities of general fault detection mechanisms are very restricted in asynchronous environments by Fischer-Lynch-Paterson's (FLP) impossibility result [22].

The FLP impossibility result deals with *Consensus* problems (like leader election, voting or failure detection in distributed system), in which all functioning processes have to propose and agree on a value (called decision value). Roughly, the FLP impossibility result says the following: if we consider a system of completely asynchronous processes (or nodes), where

- we cannot make assumptions about relative speeds of the processes or the speed of communication,
- but we assume that the communication is reliable and at most one node may fail (stop permanently) at any time,

then we can never determine if a node/process has died or if it is just very slow in sending messages. The main corollary of this result is that any kind of Consensus problem has no solution in totally asynchronous systems under these conditions.

Therefore, developing fault tolerance for an asynchronous system requires making some assumptions about the system or about the kinds of faults which can be handled. Usually one assumes an upper bound in communication and processor speed, and declares a process dead if it does not respond within a certain time.

The concept of *unreliable failure detectors* introduced by [14] gives a minimal set of properties that a failure detector must have for solving the Consensus in asynchronous distributed systems. An unreliable failure detector

may also make a mistake in detecting a failed process, but it is able to correct this error at a later time. This is guaranteed as long as the unreliable failure detector meets the following two requirements [14]:

Completeness There is a time after which every process that crashes is permanently suspected by some correct process.

Accuracy There is a time after which some correct process is never suspected by any correct process.

This technique has some practiced advantages. For instance, if such a failure detector is distributed (this is the usual case) and each node can access to its own detector, then detectors do not need to agree in the detected failed nodes. Furthermore, the failure detection service does not have to be centralized. Therefore, this concept is ideal for large scalable distributed architectures, like Globus [68].

2.2.2 Fundamental Fault Tolerance Techniques

There exist various fundamental techniques to tolerate detected failures in distributed systems [7, 34]:

- To organize a distributed activity as a collection of *transactions* whose effects become durable on commit time; this is a popular basis for database-oriented applications but does not integrate well with parallel programming models.
- By replication of resources or services on multiple servers such that, if server fails, a request is handled by another one. Since parallel programming systems are concerned about optimal use of resources, only few systems apply this approach [1, 3] (see also the description of primary backup systems in the next section).
- Most frequently, parallel programming environments pursue fault tolerance by *checkpointing*: they regularly save global snapshots of the session state on stable storage such that a failed session can be restarted from the last saved state (potentially migrating tasks to other machines); stable storage can be implemented by disks or by replicated copies in the memories of multiple machines [52, 56]. Some systems perform checkpointing transparently to the application, often on top of PVM [17, 12, 28, 40, 37] or MPI [55]. Other systems rely on application support for checkpointing [5, 46].

• Many metacomputing and message passing frameworks do not provide built-in fault tolerance at all. Rather they include failure detection and handling services that enable the user to deal with failures on the application-level. Examples of such systems are the Globus toolkit [68], the Harness environment [44], PVM [27] or FT-MPI [21].

All these approaches are relatively complex because they have to deal with general parallel computations; for special problems much simpler solutions exist [32]. However, also parallel programming models that are more abstract than message passing should allow to deal with fault tolerance in a simpler way. While this is not yet completely true for the coordination language Linda [4], the *functional* programming model provides this potential to a large degree [33].

2.2.3 Server Fault Tolerance in Distributed Systems

One of the popular way to achieve server fault tolerance is to apply the approach of *primary backup systems* [11, 53, 74]. Primary backup systems provide fault tolerance capabilities by replicating the state of primary server on one or more backup servers. In case of a primary server failure, one of the backup server is promoted as the new primary server and the connections between the new server and the clients are re-established.

In the recent developments, these backup mechanisms are often mixed with some kind of transport-level fault tolerance technique [2, 70, 42]. Such systems use some kind of extension of a transport-level protocol like TCP for two reasons. First, they can reduce the extra overhead of the logging the primary server state during the normal operation by broadcasting the TCP byte stream from a client to primary and backup servers simultaneously. Secondly, they can hide a server failure from the clients, because the modified TCP protocol keeps the connections between the server and the clients alive while a backup server is activated.

The main disadvantage of primary backup systems is that they require extra hardware components, at least a backup server (which is not exploited at all during the normal operation). Hence, this approach gives a suitable solution only for those applications that are important enough to pay for extra hardware (e.g.: e-commerce applications). Another problem with primary backup system is the limited number of tolerated server failure. Namely, if the (last) backup server also fails, the whole session fails (or aborts) independently from the state of the rest of members in the session.

In ST-TCP [42], the TCP byte stream is "tapped" at an intermediate point between the client and the primary server by some kind of physical

network interface; byte sequences sent by either the server or a client are forwarded to at least one backup server. The backup servers keep their state consistent with the state of the primary server by executing the same sequence of requests as primary server does. By this, a backup server is able to substitute for the primary server immediately in case of server failure (active backup server).

Unfortunately, this kind of server replication technique can be used if and only if operation of the server is deterministic. Replication of non-deterministic servers in this way has not been solved yet. Nevertheless, this mechanism may be also capable to detect a Byzantine failure of primary server since the backup servers receives the responses of the primary server sent to the clients. If the system contains more than one backup server and their generated responses are different from that one which the primary server issued, the faulty server can be determined by some kind of voting algorithm.

Another approach for the automatic handling of server failures is to select a machine as the new root from the the rest of the distributed session. This can be done by a *leader election* algorithm. The specification of leader election in synchronous systems says (roughly) that a system is always able to reach a state in which all operational nodes agree on the leader. In asynchronous systems (with failures) as stated above, this kind of consensus problems is not solvable [22].

In the *Invitation Algorithm*, Garcia-Molna gives a specification based on the idea of groups for solving leader election in asynchronous system [25]. A group is a set of nodes that agree on a leader. This algorithm is used by the group communication system in Amoeba [35] to reconfigure a group after a node crashes.

In the Invitation Algorithm, each node has a unique priority and each is a member of a common group. A node i monitors the leader of the group by sending a message periodically and waiting for a reply. If it does not arrive within a limited time period, i triggers a leader election. In the first step, i makes new a group with itself as the leader and the only member. Then a leader i sends a message **check** to every other node periodically asking whether there exists any other leader. If at least one node replies that it is a leader, the node i suspends its leader election activity for a time that is inversely proportional to its priority (this may help to prevent initiating of concurrent elections). After this time expired, i resumes its started leader election and invites every other leader by a message merge to join a new group with node i as leader.

When a leader receives a message merge, it forwards it to all members of its own group. Any node j which receives such an invitation (directly or indirectly) accepts it by sending a message accept to node i (the proposed

potential leader), which acknowledges it with a message answer. If j receives this message answer within some timeout period, then it joins the new group with i as a leader. Otherwise, j establishes a singleton group with itself as the leader again and starts to send check messages.

Unfortunately, the specification of Invitation Algorithm is too strong in some situations [69], because it does not allow to break a connection between two nodes.

Chapter 3

Distributed Maple

Distributed Maple is a Java-based system for implementing parallel programs in the computer algebra system Maple [58]. The starting point of development on Distributed Maple was in 1998 the goal to parallelize parts of the software library CASA (computer algebra software for constructive algebraic geometry). CASA has since 1990 been developed by various researchers at RISC-Linz [45] on the basis of the computer algebra system Maple [72].

The system has been employed successfully to develop the parallel versions for various non-trivial methods and applications in computer algebra and algebraic geometry, e.g., bivariate resultant computation, real root isolation, plotting of algebraic plane curves, plotting of surface to surface intersections and neighborhood analysis of algebraic curves [61, 62, 63].

Distributed Maple is portable and has been used in numerous parallel and networked environments, e.g. clusters of Linux PCs and Unix workstations, a Sun HPC 6500 bus-based shared memory machine, an Origin 2000 NUMA multiprocessor, and heterogeneous combinations of these. In [60], we have analyzed the system performance in these environments in large detail.

Since the system does not require any special kernel extensions it should also be portable to any new commercial version of Maple. Furthermore, an interface of the coordination program to another computer algebra system Mathematica has been developed [47]. Starting from the initial design [59], the system has gradually been refined and extended. The follow general description is based on [58, 66].

3.1 Use of the System

The user interacts with Distributed Maple via a conventional Maple frontend (text or graphical), i.e., she or he operates within the familiar Maple

environment for writing and executing parallel programs (see Figure 3.1). Maple commands establish a distributed session in which computational tasks can be processed on any connected machine. The following simple example demonstrates the usage of the environment:

```
gemini!5>maple
             Maple V Release 5.1 (Universitaet Linz)
._|\| |/|_. Copyright (c) 1981-1998 by Waterloo Maple Inc. All rights
 \ MAPLE / reserved. Maple and Maple V are registered trademarks of
 <____ > Waterloo Maple Inc.
             Type ? for help.
> read'dist.maple';
Distributed Maple V1.1.15 (c) 1998-2001 Wolfgang Schreiner (RISC-Linz)
See http://www.risc.uni-linz.ac.at/software/distmaple
> dist[initialize]([[condor,linux],[pinwheel,octane]]);
connecting condor ...
connecting pinwheel...
                                    okay
> t := dist[start](int, x^n, x);
                                    t := 0
> r := 1 + dist[wait](t);
                                        (n + 1)
                              r := 1 + -----
                                        n + 1
> dist[terminate];
                                    okay
> quit;
```

To use the system, the user first has to load the file dist.maple which implements the interface to the distributed backend by a Maple package dist. By dist[initialize], she or he can trigger the establishing of the distributed backend. In our example, two additional Maple kernels are created on machine condor of type linux and on machine pinwheel of type octane, respectively. The machine types are used to lookup the system-specific startup and performance information which is located in a file dist.systems.

If the remote processes are successfully started, the user can start the processing of her computational tasks right away by issuing the command dist[start]. The command dist[wait] blocks the current execution until the corresponding task whose identifier is given in the command as an argument has terminated and then return its result. Finally, the user has to use the dist[terminate]. This command closes the distributed session by destroying all remote Maple kernels and closing all network connections.

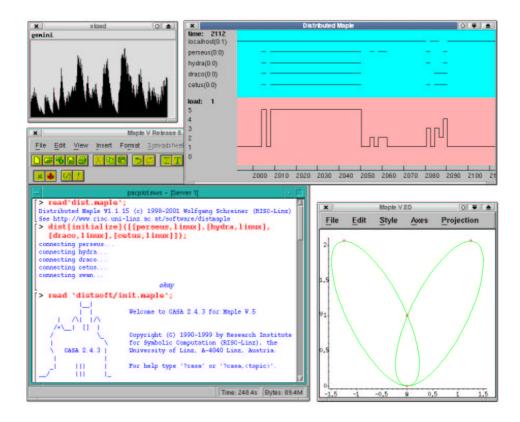


Figure 3.1: The User Interface of Distributed Maple

3.1.1 User Manual

In this section, we give a detailed but not complete description of the programming interface in Distributed Maple [58].

Initialization and Termination of a Distributed Session

- dist[initialize] (machineList) initializes a distributed Maple session by starting remote processes and establishing the corresponding network connections. Each element of machineList is a list [machine, type] where machine is the domain name (or IP address) of a machine and type is a predefined key which denotes a machine type. By this type parameter, the system is able to determine the system specific startup and performance information for every supported platform.
- dist[terminate]() terminates the current distributed Maple session by destroying all remote Maple kernels and closing all network connections. This procedure should be called before quitting the interactive Maple session.

• dist[all](command) executes command on every Maple kernel connected to the distributed session.

Functional Parallelism

- dist[start] (f, a, ...) creates a task that computes f(a, ...) on some Maple kernel connected to the distributed session.
- dist[process] (f, a, ...) This call creates a task that computes f(a,...) on a separate (possibly newly created) Maple kernel. This kernel has executed all the commands issued through previous calls of dist[all] in the corresponding order. During the execution of the task, no other task is scheduled on the kernel.
- dist[wait](t) suspends the current execution until task t has completed and then returns its result. While the current execution is suspended, other tasks can be executed by the corresponding Maple kernel.
- dist[select](taskList) suspends the current execution until the execution of some task in taskList has completed; it then returns a selector for this task, i.e., a list [index, result] where index denotes the position of the task in the list and result is its result.

Shared Objects

- d := dist[data] () creates a shared object d that may be used to communicate data between different tasks. The object is initially empty.
- dist[get](d) returns the value of shared object d; if d is still empty, the current task is blocked until a value is put into d.
- dist[put](d, v) puts the value v into the shared object d and releases all tasks blocked on an attempt to get a value from this object.
- dist[clear](d) resets the shared object d into the empty state. Further attempts to get a value from d blocks the corresponding task.

3.1.2 Visualization

Distributed Maple supports on-line visualization to illustrate the dynamic behavior of a session during its execution. When the user issues a command dist[visualize] during the session, a window pops up in which the workload status of each machine and the utilization of the total system resource are displayed (see the window on the right side on the top in Figure 3.1).

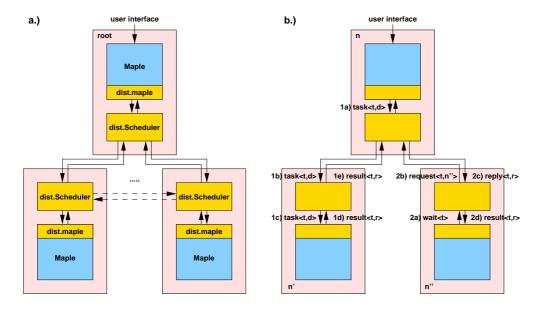


Figure 3.2: a.) System Model b.) Execution Model

This real-time visualization window is split to two parts. Its upper half part shows which machine processes one or more tasks and which one has no any job at the same time (workload). The lower half part of the window displays how many machine works together at the same time (resource utilization).

3.2 System and Execution Model

A Distributed Maple session comprises a set of nodes (machines, processors) each of which holds a pair of processes: a (e.g. Maple) kernel which performs the actual computation, and a scheduler (a Java Virtual Machine executing a Java program) which coordinates node interaction (see Figure 3.2a). The scheduler communicates, via pairs of sockets, with the kernel on the same node and, via sockets, with the schedulers on the other nodes. The communication protocol between the scheduler and the kernel is implemented by dist.maple interface. The root is that node from which the session was established by user interaction with the kernel. Initially, a single task is executing on the root kernel; this task may subsequently create new tasks which are distributed via the schedulers to other kernels and may in turn create new tasks.

The parallel programming model is basically functional (see Figure 3.2b): from the perspective of a scheduler, a kernel on node n may emit a number of messages task: $\langle t, d \rangle$ where t identifies the task and d describes it. The

task needs to be forwarded to some idle kernel which eventually returns a message result: < t, r > to n where r represents the computed result. r is stored in a table resultTable on n. When a kernel emits wait: < t >, this task is blocked until the scheduler responds with the result of t. Thus, if this result is not yet available, the scheduler may submit to the now idle kernel another task; when this task has returned its result, the kernel may receive the result waited for or yet another task.

A task identifier t encodes a pair < n, i> where n identifies the node on which the task was created and i is an index. Initially, every kernel receives from the scheduler the index n of the current node and an interval $[i_{min}, i_{max}]$ which it may use to assign an unique identifier t=< n, i> with $i_{min} \le i \le i_{max}$ to every newly created task (the scheduler reserves part of the representable index range for the creation of additional kernels). The identifier t of a task thus always describes the node n on which the task was created (and on which the task result is stored); this node n thus serves as the rendezvous point between node n computing the result of t and node n requesting this result.

When the scheduler on n receives a $\mathtt{task}:< t,\ d>$ from its kernel, it thus allocates a result descriptor that will eventually hold the result r; the task itself is scheduled for execution on some node n. When a kernel on some node n issues a $\mathtt{wait}:< t>$, the scheduler on n forwards a $\mathtt{request}:< t,\ n$ to n. If r is not yet available on n, this request is queued in the result descriptor. When the kernel on n eventually returns the $\mathtt{result}:< t,\ r>$, the scheduler on n forwards this message to n, which constructs a $\mathtt{reply}:< t,\ r>$ and sends it to n.

By a message all:<mand>, all nodes can be initialized together, because its argument command is executed on every Maple kernel in a session.

3.2.1 The Scheduler

As mentioned before, the scheduler is a Java program which distributes and coordinates the tasks created by all kernels. After establishing of a distributed session was triggered by the user, an initial scheduler process alias root scheduler is created first by the local Maple kernel. Then this scheduler reads all system-specific startup and performance information from a file dist.systems and starts the other instances of the scheduler on remote machines. Then each of these remote instances starts and initializes its own local computation kernel.

After a distributed session has been created, every scheduler instance accepts tasks from its local Maple kernel and forwards them to the root scheduler. The root schedules these tasks among all nodes connected to the session by a simple load balancing algorithm (see in Section 3.2.4).

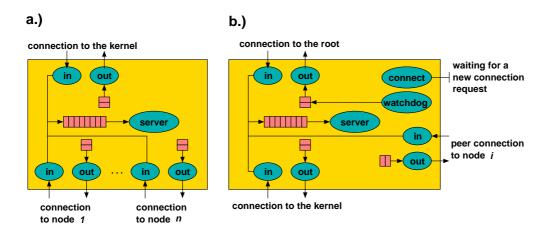


Figure 3.3: a.) Scheduler Architecture on the Root b.) Scheduler Architecture on Non-Root Nodes

The root scheduler consists of a number of concurrent threads as shown in Figure 3.3a. A central server thread implements the main functionalities of the scheduler. This thread takes out the received messages from the central input buffer one by one and processes them sequentially. To each input channel, an other kind of thread called *input thread* is assigned that listens on the channel. If a message arrives from a channel, the corresponding input thread puts it into the central input buffer.

To send a message, the sender (thread) has to put the message into the corresponding output buffer. Namely, each output channel has an own buffer (there is no central output buffer) and an own thread, too. These threads are called *output thread* and their task is to read the message from the output buffer and to write it on the output channel.

The architecture of non-root schedulers is almost the same, but they have two additional threads called *connect thread* and *watchdog thread* (see Figure 3.3b). The role of connect thread is to wait for peer connection requests from other non-root nodes and to establish input/output channels for a peer connection after such a request (see for more details in Section 3.2.2). In the watchdog thread, the mechanism *watchdog* is implemented (see Section 3.2.3).

3.2.2 Peer Connections

Initially, there exists a connection only between the root (the local node) and each remote node. However, all nodes know of each other, i.e., of a machine address and the number of a port on which a connect thread is listening for connection requests. When a node needs to send a message to one of its

peers, thus a direct connection is established for the message transfer. These connections remain persistent through the rest of the session.

3.2.3 The Watchdog Mechanism

The only mechanism originally available in Distributed Maple for handling faults is a *watchdog* mechanism on every non-root node that regularly checks whether a message had been recently received from the root. If not, it sends a ping message to the root that has to be acknowledged. If no acknowledgement arrives from the root within a certain time bound, the node shuts itself down.

3.2.4 Load Balancing

A core problem of distributed system is to exploit the system resources most efficiently by load balancing. The various load balancing techniques tries to reduce the global execution time by assigning statically or dynamically more workload to more powerful resources. Static load balancing attempts to determine appropriate shares of work to be distributed to processors at application startup, while dynamic load balancing may redistribute some part of the work during the execution in order to compensate for differences in processors performance [38].

Distributed Maple has a very simple static load balancing algorithm which is able to measure neither the performance nor workload of the processors. Namely, to initialize a distributed session, the user has to give names or IP addresses of all machines of which the session consists and a predefined key for each machine which denotes a machine type (e.g.: linux, octane, origin, ultrasparc, etc.). By these machine types, the root scheduler can find (among others) some system-specific performance information in a file dist.systems for each machine. These are the followings:

- the relative *speed* is a performance factor of a machine type,
- the *maxload* denotes the maximum number of executable but not yet started tasks that a kind of machine may hold at a time,
- and the *minload* denotes the minimum number of executable but not yet started tasks that a kind of machine should hold at a time.

The root scheduler always distributes the task among the nodes by using these static performance factors independently the real workload state of processors at a time. Of course, this solution is less efficient than a load

balancing according to the real workloads (e.g.: some other users or applications maybe use the corresponding machines, too), but it is still sufficient for our current requirements.

Roughly, the root scheduler first attempts to schedule a task to the fastest node on which there is no any task under processing. If there is no such a node, the root scheduler tries to find the fastest node on which the number of scheduled but unfinished tasks is less than the *maxload*. If the root scheduler does not find such a node, it schedules the task to the queue of own local kernel. If the number of scheduled but unfinished tasks on a node becomes less than the *minload*, the node notifies the root scheduler about this fact.

3.2.5 Shared Objects

The functional model is not the only one by which tasks in Distributed Maple may interact with each other: they may also use self-synchronized *shared objects* for a producer/consumer (or, more general, dataflow-like) kind of operation. From the perspective of a scheduler on some node n, the local kernel may issue a message $\mathtt{data:} < t >$ which requests the allocation of a shared object with identifier t taken from the range of task identifiers assigned to the kernel. Actually, a shared object is not else as an result descriptor that is stored on node n (on the node where it was created).

If we compare the shared objects with tasks, the only difference is that a shared objects receives its value r by a message $\mathtt{put}:< t,\ r>$ instead of $\mathtt{result}:< t,\ r>$. Any task that knows t may issue a put message, if the corresponding shared object is still empty. However if a kernel on some node n needs the value r, it also sends a message $\mathtt{wait}:< t>$ to node n as in the case of requesting task results.

3.3 Failure Analysis

There are numerous possibilities for faults that may cause a session failure:

- a machine becomes unreachable (usually a transient fault, i.e., the machine is rebooted or is temporarily disconnected),
- a process in the scheduling layer or in the computation layer crashes (a bug in the implementation of the Java Virtual Machine, of the Java Development Kit, of Maple, or of Distributed Maple itself) or
- the computation itself aborts unexpectedly (a bug in the application).

While the last issue can be overcome and the Distributed Maple software itself is very stable, there certainly exist bugs in the lower software levels that are out of our control; machine/network/operating system faults may happen in any case.

All of the possibly fault cases mentioned above can be classified into the following failure types [41]:

Communication failures This kind of failures cover those situations in which a message is lost or duplicated or becomes corrupted.

Stop failures A session or a part of a session (e.g.: a kernel process, a scheduler process, or a node) can stop somewhen in the middle of its execution by several reasons.

A connection may also interrupted such that communication becomes impossible at all (permanently or for a limited period).

Byzantine failures A faulty process (or machine) can exhibit completely arbitrary behavior.

We do not deal with the tolerating of Communication failures and Byzantine failures (our system currently is not able to handle corrupt, lost or duplicated messages and corrupt task executions). In the functional parallel programming model, the Communication failures may be handled similarly as in the message passing or any other general parallel programming model; there exist already numerous general and effective algorithms for tolerating of this kind of failures [41].

We focus on Stop failures and we assume in this paper that only such failures may occur (a part of the system can exhibit Stop failure simply by stopping somewhere in the middle of its execution). In more detail, we deal with the following error situations:

- the root of the tree of computation nodes crashes,
- some non-root node crashes,
- some Maple process aborts,
- a connection between the root and another node breaks and
- a connection between two non-root nodes breaks.

We say that a node crashes if the machine stops execution or reboots, or if the Distributed Maple process aborts. In the original system, we had to restart the computation in each of these cases. If the root crashes, the system aborts; in all other cases, it deadlocks and must be stopped manually.

Chapter 4

The Logging Mechanism

The first step towards fault tolerance is to store from time to time consistent states of a computational session. If the session fails for any reason, the computation does not need to be restarted from the scratch, because it can continue from such a stored intermediate state of the session.

To achieve this goal, one of the most popular general algorithm is *check-pointing*, which regularly saves global snapshots of the session state [17, 12, 28, 40, 37, 55]. The checkpointing algorithm can deal with all side-effects of processes (because it saves the whole state of each node and the sent but not yet received messages). However, the execution phase of the system is periodically interrupted by a checkpointing phase which has some negative consequences for the performance.

The functional programming model of Distributed Maple simplifies the problem, because the tasks are computed and return results without causing any side-effects. Consequently, it is enough to log the results of tasks and values of the shared objects for storing a consistent state of a session. If the session fails for any reason, we can thus start it and read the logged data (transparently to the application program) without re-executing the corresponding tasks.

This "Logging" mechanism [64, 65, 8] is based on the centralized architecture of the system and only requires that the root is connected to a stable storage system. Every task created by any node is forwarded to the root which schedules it for execution on another node (see Section 3.2). After a session failure, the root attempts to recover the corresponding task result before scheduling the task. Thus the recovery process does not need to send additional messages (no extra communication) and a computed task is recovered if and only if its result is needed for the further computation.

However, logging task results needs extra work to be done, because in normal operation, tasks are processed on various nodes and the results are not sent to the root. Hence, we need an extra message to send each result to the root in order to log it.

Furthermore, our "Logging" mechanism is complicated by the fact that task arguments and results may embed task identifiers and that the scheduling layer of Distributed Maple has only a limited amount of information about the activities of the computing layer.

The system supports two kinds of logging modes which are based on different assumptions (see Section 4.1) and can be selected on the startup of a session: Section 4.2 describes the *Fast Mode*, which is quite simple and very effective. Section 4.3 discusses the more general *Safe Mode* which contains some additional operations. Section 4.4 explains how the "Logging" mechanism is extended in order to incorporate shared objects.

4.1 Assumptions and Guarantees

For the correct working of the "Logging" mechanism, our assumptions are the following:

- The root has access to a writable file system on which it can implement a stable storage.
- The communication is reliable between the system components. Messages are never corrupted or duplicated and they may be lost only in *Stop* failure situations.
- All system components work correctly (no *Byzantine* failures).

Please note our assumptions do not exclude *Stop* Failures which may occur in arbitrary periods. If the system satisfies these conditions, we can provide two kind of logging and recovery mechanisms, which are called:

- **Fast Mode** is the base of the "Logging" mechanism. In this mode, we restrict our consideration to programs whose tasks are *first order*: neither any task description nor any task result contains a task identifier, i.e., task identifiers are not passed as parts of task arguments and are not returned as parts of task results.
- **Safe Mode** is the advanced "Logging" mechanism, in which we allow to use *higher-order tasks* (tasks which receive task identifiers as arguments or return them as results).

In both modes, we guarantee, that if the system fails in Safe Mode, we can restart it and we can continue the computation from a saved state. However, human activity is needed for the restarting of the system.

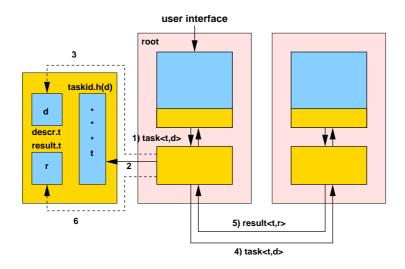


Figure 4.1: Logging task description and task result in Fast Mode

4.2 Fast Mode

In Fast Mode, all basic functionalities of the "Logging" mechanism are already realized but methods are missing for handling task identifiers embedded in task descriptions and in task results.

4.2.1 Algorithm

The "Logging" mechanism utilizes the fact that in Distributed Maple the root is in charge of task distribution: every new task:< t, d> is forwarded to the root which eventually assigns it to some node for execution. The operations dealing with result logging and failure recovery are as follows (see Figure 4.1):

Logging When the root receives a task: $\langle t, d \rangle$, it computes a numeric hash code h(d) and appends to file taskid.h(d) the task identifier t. Then the root starts an asynchronous thread to write the task description d into a new file descr. t.

When a node sends a $result: \langle t, r \rangle$ to some node n different from the root, it forwards a copy to the root. When the root receives this result, it creates an asynchronous thread to write the task result r into a new file result.

All data are written in a format that enables a reader to recognize incomplete writes. At any time, taskid.h(d) holds a sequence of task identifiers t (the last of which may be incomplete) for which there may exist description files descr.t and/or result files result.t (both with

possibly incomplete contents). When the session terminates without failure, the log files are discarded.

Recovery When a session is re-started after a failure, the root may receive from a node n a task:< t, d> such that a file taskid.h(d) exists. If for some complete task identifier t' in this file there exist file descr. t' with a complete description identical to d and file result. t' with a complete result r, the root need not schedule this task for execution but may immediately return result:< t, r> to n.

The comparison of task descriptions is required because task identifiers need not be identical across sessions; since the result r of a task only depends on its description d, the identity of descriptions is a sufficient condition to ensure the identity of results.

The mechanism is simple and efficient: the only overhead occurs on the root for writing the log files (the potentially large task descriptions and results are written by asynchronous threads) and, if a task is created on a node other than the root, the sending of a duplicate result to the root.

4.2.2 Implementation

The most important issue which we had to determine at the beginning of the implementation was how to identify logged results. We cannot use task identifiers for this purpose, because they are not the same in different sessions (however, we should store the task identifiers, too, because they are needed for the recovery of higher-order tasks, as we can see later in Section 4.3). The only thing which uniquely identifies a task result is its description. Thus, the "Logging" mechanism has to store the task descriptions, too.

Roughly, the mechanism works in the following way. As mentioned before, the root receives all task descriptions created by all nodes. Before the root schedules a task for execution, it tries to restore the result of the task from the storage system (because the result may be computed and stored in a previous session). If it cannot restore it, it saves the description and schedules the task. When the result is computed, the root receives it and saves it to the storage system.

The system stores each piece of data (descriptions and results) in different files, so that the loss of data can be minimized after a I/O failure. The logged data are identified by both the task identifiers and hash codes generated from the task descriptions.

The implementation of this mechanism has to take care of some other issues:

- Two or more task descriptions may have the same hash code.
- The description of a task may not be stored (yet) or it is stored but corrupted.
- The result of a task may not be stored (yet) or it is stored but corrupted.

New Data Structures and Messages

Two additional kinds of messages had to be implemented:

- By a message **stable**: < **mode** >, the logging mechanism can be switched on or off and the active logging mode can be changed. It has only one argument, which is the identifier of such a mode (value **1** switches on the Fast Mode, value **2** switches on the Safe Mode and value **0** switches off logging).
- In a message **store**: $\langle t, r \rangle$, a computed task result is sent to the root in order to save the result to the storage system. The message has two arguments, the identifier t of a task and the result r of this task.

New Files

The "Logging" mechanism saves all necessary data into a logging directory using the following files:

- A file **result**. t contains a task result identified by file extension t.
- A file **descr.** t contains a task description identified by file extension t. In Fast Mode, this file is only needed to identify a result of a particular task for recovery. But in Safe Mode described in Section 4.3, the system may restore the description of a particular task from this file by identifier t, too.
- The file taskid.h(d) contains basically the identifier of the task assigned to task description d. The file extension h(d) is a numeric hash code computed from d. This file allows of access the corresponding files result.t and descr.t by a task description. Unfortunately, we cannot guarantee that a composed hash code is unique for each task description. Therefore, it may occur, that a taskid.h(d) file contains more than one task identifier (because two or more task descriptions have the same hash code).

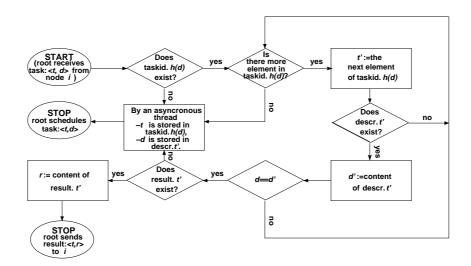


Figure 4.2: Recovery in Fast Mode

The system has to be able to check whether a particular file contains valid or corrupted data, because a previous session could crash during the writing of this file. Therefore, every file contains a new line character at its end and the restore mechanism always checks whether the end of a file is a new line character (data cannot contain this character). If this is not the case, the system does not read and restore the content of the file.

Every file is written without any buffering procedure in order to minimize the loss of data in case of a session failure.

Starting Logging in Fast Mode

The user can switch on the Fast Mode by the call dist[logging](1). It is allowed to issue this call only after a session is established (see the description of call dist[initialize] in Section 3.1.1).

The effect of this command is that the Maple frontend sends a message stable:<1> to the root scheduler. When the root scheduler receives this message, it creates the logging directory (if it does not exist) and it broadcasts message stable:<1> further to every node. By this notification, every node changes to Fast Mode.

Result Recovery by Task Description

When the root scheduler wants to check whether a result has already been stored for a task description d, it generates a hash code h(d) from d and looks for a file taskid.h(d) (see Figure 4.2). If such a file exists, it takes

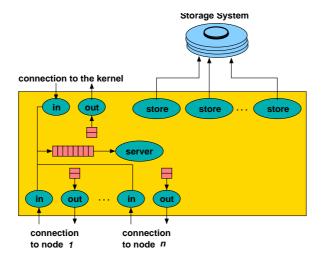


Figure 4.3: Scheduler Architecture on the Root in Fast Mode

the first task identifier t contained by this file and it compares d with the content of file $\mathtt{descr.}t$. If they are identical, the root scheduler recovers the result contained by $\mathtt{result.}t$.

If $\mathtt{descr.}t$ does not exist, or it exists, but its content is either corrupted or not equal to d, then the root scheduler takes the next task identifier from $\mathtt{taskid.}h(d)$ and it tries to recover the task result for d by this identifier, too. If there is no more element in $\mathtt{taskid.}h(d)$, the recovery operation cannot restore the result for description d. The recovery mechanism may be also unsuccessful, if $\mathtt{taskid.}h(d)$ or a particular result file is missing, or their contents are corrupted.

Modified Task Message Handling

When a scheduler on a non-root node receives a message task: < t, d > from a local kernel, it forwards this message to the root. If the Fast Mode is active and the root scheduler receives a message task: < t, d >, it checks whether it can restore the result by description d from the storage system (as described in the previous paragraph).

If the recovery is unsuccessful, the root scheduler creates a concurrent thread to save d into a file $\operatorname{descr.} t$ (separately from the main scheduler functionality implemented in the central server thread, see Figure 4.3). Then the task t is scheduled to a node.

If the recovery is successful, the root restores the result r of the task t and sends it in a result: $\langle t, r \rangle$ message to the node which created this task (the identifier of this node can be determined from the task identifier t).

Store Message Handling

When a kernel has computed the result r of a task t, it sends a message result: $\langle t, r \rangle$ to the local scheduler. This scheduler forwards this message to the node which created task t and also sends a duplicate of r in a message store: $\langle t, r \rangle$ message to the root. If the root scheduler receives a message store: $\langle t, r \rangle$, it creates a subsequent concurrent thread to save r into a file result.t (separately from the main scheduler functionality implemented in the central server thread, see Figure 4.3).

4.3 Safe Mode

The mechanism described in Section 4.2 guarantees correct results if task arguments and result do not embed task identifiers. However, assume that a task t creates another task and embeds its identifier t' in result r. If r is logged and the session fails, in the recovery session this result may be read from the log such that task identifier t' is re-created. A task may subsequently issue a wait: $\langle t' \rangle$ referring to a no more existing task or, even worse, to a task that computes a different result than in the failed session.

In order to allow higher-order tasks (tasks which receive task identifiers as arguments or return them as results), we have to guarantee that each task description is always logged to the storage system before other task descriptions or task results which may contain its identifier are logged. The idea is that the description of any task created by a previous session can always be recovered and rescheduled, if another task refers to it by its identifier, but its result is not available. How can we achieve this?

We analyzed the possible relations between the tasks and we managed to determine those situations in which a task t may know the identifier of another task t'. These are the following:

- If t establishes t' (t is the parent of t').
- If t and t' have a common parent and t' is established earlier than t. In this case, the description of t may contain the identifier of t'.
- If the parent task of t' embeds the identifier of t' into its result. t may receive this result as the answer for its issued wait message.
- At last, if t' is the parent of t. t' may build in its own identifier into the description of its spawn task t.

We subsequently refined the "Logging" mechanism to satisfy the following conditions:

Condition A A task description may be written to the storage system if and only if all task descriptions previously created by the same node have been completely stored (because the current task description might contain the identifier of such tasks). If the description of the current task were stored earlier than the descriptions of some previously created ones and the system crashed before the descriptions or the results of the previously created tasks were completely written to the storage system, then the next session would refer to some no more existing tasks.

Condition B A task description may be scheduled to a node if and only if the task description has been completely stored to the storage system. Otherwise, this task might create some other tasks whose descriptions contain its task identifier. If these task descriptions were stored earlier than the description of their parent task and the system crashed before the description or the result of this parent task were completely written to the storage system, then the next session would refer to a no more existing task.

Condition C The result of a computed task may be sent to another node if and only if all the task descriptions created by this task have been completely stored to the storage system. Otherwise, the result of the computed task might contain the identifier of its spawn tasks. If another task received this result and created some new tasks description by using of the received identifier (or the result is simple logged) before the description of these spawn tasks were completely written to the storage system, then the next session would refer to no more existing tasks.

4.3.1 Algorithm

In order to distinguish task identifiers of different sessions, we introduce a session identifier s. In a session that does not represent the recovery of a previously failed session, the session identifier is initialized to 0 and a file session is written with content 0. In a recovery session, the previous identifier s is read from session, the new session identifier is taken as s+1 and overwrites the content of session. If the recovery session also fails, a new recovery session may be initiated and thus the session identifier may grow to an arbitrary size (subject to an implementation limit).

A task identifier now encodes a triple $\langle s, n, i \rangle$ that embeds the number s of the session in which the corresponding task was created. The mechanism described in Section 4.2 is now generalized as follows:

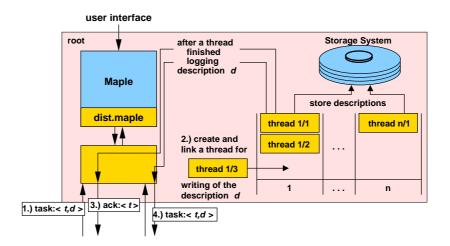


Figure 4.4: Logging Task Description in Safe Mode

Logging To support higher-order tasks, the basic "Logging" mechanism described in Section 4.2 has to be extended with some additional functionalities such that the previously mentioned three conditions are satisfied:

- For achieving Condition A, the root maintains a queue for each node (see Figure 4.4). When it receives a task: <t,d> and the result for description d cannot be recovered, the root creates a thread to write d to the storage system as in Fast Mode. But instead of starting this thread immediately, the root places it as the last element into the queue of that node from which the message arrived. If this newly inserted thread is the first element of the queue, it is started immediately. Every thread which is the first element of a queue writes a description asynchronously to the storage system. Before a thread finishes its activity, it starts the next thread in the queue. So, the descriptions created on the same node are written sequentially to the storage system. Since the order of messages sent from a node to another does not change during a transmission, we can guarantee that these task descriptions are stored in the order of their creation.
- For achieving Condition B, the root schedules a task to an idle node if and only if logging of the task description is completed. This practically means the previously mentioned threads have to schedule the tasks after they logged the task descriptions to the storage system.
- For achieving Condition C, a result message received from a local kernel is not anymore forwarded immediately to the root or to

the node on which the corresponding task was created (because the description of each spawn task created by the computed task has to be logged first to the storage system). To inform the corresponding node (on which the result message is created) about the completed logging process of a task description, the root uses a new message type called ack:< t>, where t is task identifier belongs to the logged task description (see Figure 4.4).

Furthermore, for each scheduled task t, the node computing the result of t maintains a set S_t . S_t denotes all tasks created by t; for a subset S_t^a the acknowledgements about completed logging of descriptions have already arrived. If a result: $\langle t, r \rangle$ message arrived from the local kernel, where r is the computed result of t, but $S_t - S_t^a$ is not an empty set, then the message will be stored locally. When an ack: $\langle t' \rangle$ is received, where t' is an element of S_t (t' is a spawn task of t), $S_t - S_t^a$ will be evaluated again. The locally stored result of t may be forwarded to other nodes if and only if $S_t - S_t^a$ is an empty set.

Recovery In addition to the actions described in Section 4.2, we have to deal with task identifiers that may (via logged descriptions or results) refer to previous sessions: the root is in charge of such tasks.

If a kernel on node n issues a wait:< t> where the session identifier of t is not that of the current session, the scheduler on n sends a request:< t, n> to the root. If the root receives this request, it looks up whether it holds a result descriptor for t; if yes, it proceeds as usual, i.e., it responds with the result or, if this is not yet available, queues the request in the descriptor.

If the root does not hold a result descriptor for t, it creates one and queues the request there. It then looks up file result t for the result of t logged in a previous session. If this file exists and holds a complete result t, the scheduler writes t into the descriptor and responds with reply:t

Otherwise, the scheduler looks up the file descr.t for a description d of t. If the file does not exist or holds an incomplete description (which is only possible if the task t was created in a session operating in fast mode), the scheduler aborts the session; the computation has then to be restarted from scratch.

Otherwise, the scheduler creates a new task: < t, d> which is handled as usual. When a kernel issues a result: < t, r> of a task created in a previous session, the scheduler forwards this result to the root.

There is one more case which has to be covered to allow higher-order tasks. Assume that the description and the result of a task t is logged into $\mathtt{descr.}t$ and $\mathtt{result.}t$. After a session has failed, the description of a task t' may be identical with the logged description of t in the next session and the result of t is recovered as the result of t'. This means neither $\mathtt{descr.}t'$ nor $\mathtt{result.}t'$ files are established. So, if session fails and restarted again, there may exist a task t'' in the newest session whose description or result contains task identifier t' as an argument. In this case, one of the kernels may send a $\mathtt{wait:} < t' > \mathtt{to}$ the root (because t' was created in a previous session), but t' does not exist any more.

The problem is either the corresponding result or at least the corresponding description is available in the storage system, but these informations cannot be assign to t. Therefore, the root establishes a file $\mathtt{link}.t$ when the result of t is recovered as the result of t by their identical descriptions. This file contains the task identifier of t. So, if a $\mathtt{wait:} < t$ is issued in a later session and root cannot recover either description of or result of t, then it attempts to recover one of them by the content of $\mathtt{link}.t$.

4.3.2 Implementation

In Safe Mode, a task description or a task result may contain some identifier of another task. It may thus occur that a message wait: <t> refers to a task identifier t which was created in a previous session. Therefore, such a message is forwarded to the root, which tries to recover the corresponding result. For this, the logged data are identified in the storage system by task identifiers (as described in Section 4.2.2).

During the implementation of this mechanism, we took care of the following cases:

- The corresponding result may already be in the memory of the root (it is more efficient to use the values in the memory instead of reading them from file).
- The result is available in the storage system and we are able to restore by its task identifier.
- The correct result is not available in the storage system, hence, the root tries to recover the description of the task by the task identifier in order to reschedule it and recompute the result.
- Neither the result nor the description of a task are available. In Safe Mode, this situation can occur if and only if a task result is recovered by

a hash code generated from a task description (in this case, the current task identifier is different from logged one), therefore the current task identifier is not stored in the storage system. In a latter session, one of the nodes may refer to this not logged task identifier and the root tries to recover the result by this identifier.

New and Modified Data Structures

- Every task is uniquely identified by its **task identifier** which consists of 3 parts:
 - 1. A session identifier (see below).
 - 2. A node identifier which says which node created the task.
 - 3. A task index which enumerates all tasks created by the node.
- The current session is uniquely identified by a **session identifier** which is part of the identifier of every task and of every shared object. Accordingly, the system always can determine which session created a particular task or shared object (see for more details in the description of the **sessionid** file in this section).
- **clientTable** is a hash table whose keys are node identifiers and whose elements are references to threads. This data structure is located only on the root and it is needed for the synchronized logging of task descriptions (see Figure 4.5).
- running_tasks is a list which contains the identifiers of all the tasks which are under processing on the primary Maple kernel of a node at the same time (when a running task executes a command dist[wait], it is blocked and another task can start execution). The head of this list refers to the currently active task. This list is needed when the system wants to determine the parent of a task (see Figure 4.6).
- externUsed is a hash table whose keys are the identifiers of the external Maple kernels which are located on the same node and whose elements are the identifiers of the tasks which run on these external kernels. This hash table is needed when the system wants to determine the parent task of a task (see Figure 4.6). An external Maple kernel can be started by a call dist[process] (see Section 3.1.1).
- taskids_list is a queue which contains identifiers of such tasks whose descriptions have not been saved by the logging mechanism yet. This queue occurs only as an element of a *created_tasks* hash table.

- created_tasks is a hash table whose keys are identifiers of those tasks which are under processing on the current node (on the primary Maple kernel or on the external Maple kernels) or which have already finished their execution but which have spawned some tasks whose descriptions have not been saved by the logging mechanism yet. Every element of this table contains a taskids_list queue which holds the identifiers of the tasks spawned by the corresponding task. When a task has finished its execution, the scheduler does not send further its result, until the corresponding entry of this hash table contains an empty taskids_list queue (see Figure 4.6).
- result_of_the_finished_tasks is a hash table whose keys are identifiers of those tasks which have already finished, but which have spawned some tasks whose descriptions have not been saved by the logging mechanism yet. This hash table stores the results of these tasks, until the scheduler can send further their results (see Figure 4.6).
- After a thread has saved a task description, it sends a message ack:< t> to the node which created this task (where t is the identifier of the task).

New Files

- A file **sessionid** stores the identifier of the last session which used the logging mechanism. When the **dist[initialize]** command is executed, the system initializes the current session identifier. It checks whether a previous session identifier exists on the storage system. If it exists, it reads and increments it. If it does not exist, the current session identifier is set to 0.
- A file link.t contains the identifier of a task whose description is identical with the description of t. Namely, the system does not create a file descr and a file result more than once for the tasks whose descriptions are identical. But it creates a file link for each latter task, which contains identifier of the first logged task. With this file, the system is able to recover the common result and the common description of these tasks by their identifiers.

Starting Logging in Safe Mode

The user can switch on the Safe Mode by the call dist[logging](2). This call may be issued only after a session is established (see the description of call dist[initialize] in Section 3.1.1).

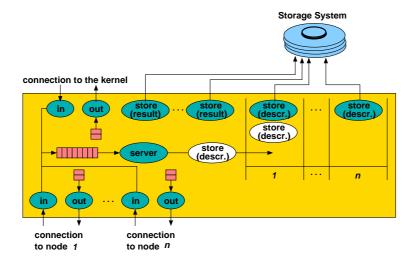


Figure 4.5: Scheduler Architecture on the Root in Safe Mode

The effect of this command is that the Maple frontend sends a message stable:<2> to the root scheduler. After the root scheduler has received this message, it creates the logging directory, (if it does not exist) and it saves the current session identifier into a file sessionid. Then it broadcasts message stable:<2> further to every node. By this notification, every node changes to Safe Mode.

Logging Task Descriptions in Safe Mode

When the root scheduler wants to save a task description to the storage system, it creates a concurrent thread for doing this, but it does not start the thread immediately (see Figure 4.5).

First, the root scheduler checks whether the identifier of the node which created this task occurs as a key in this hash table. If it does not occur, there is no description from this node currently being logged. Therefore, the root scheduler puts the reference of the thread with the node identifier as a key into this hash table and starts the thread.

If an entry whose key is the searched node identifier occurs in this hash table, the thread has to wait until the predecessor threads have finished their execution (see the threads denoted by white ellipses on Figure 4.5). Therefore, the root scheduler replaces the reference of the previous thread with the reference of the new thread in the corresponding hash table entry and creates a link from the previous thread to the new thread. Thus the previous thread can start the new one before it finishes its execution.

Before a thread finishes, it checks whether another thread from the same

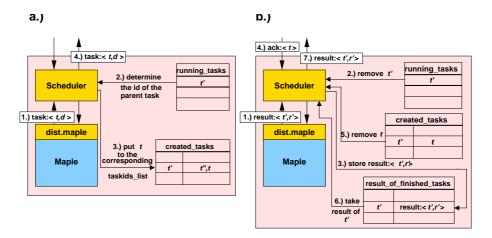


Figure 4.6: Handling of Spawned Tasks

node waits for a logging and, if yes, starts it. Otherwise, it removes its own entry from the *clientTable*.

Modified Task Message Handling

When a scheduler receives a message task: < t, d > from a local kernel in Safe Mode, it identifies the parent task t' of task t from a list $running_tasks$ (see Figure 4.6a) or from a hash table externUsed (depending on whether the message came from the primary Maple kernel or from an external Maple kernel). Using t' as a key, the scheduler adds t as an element to a queue $taskids_list$ in the corresponding entry of a hash table $created_tasks$. Afterwards, if the current scheduler is different from the root scheduler, the message task: < t, d > is sent further to the root.

After the root scheduler has received a message $\mathtt{task}:< t,\ d>$ from a node (or it received it from a local kernel) and has added t to the corresponding entry of $created_tasks$, it attempts to recover the result r of t as described in Section 4.2.2. If the root can recover r, it saves the identifier t" of the logged task (from which r was recovered) to a file $\mathtt{link}.t$. Then root scheduler sends r in a message $\mathtt{result}:< t,\ r>$ to the node which created this task and it also sends a message $\mathtt{ack}:< t>$ to the same node. If the root scheduler can not recover r, it creates a concurrent thread in order to save d to the storage system (d is logged as described previously in Subsection "Logging Task Descriptions in Safe Mode"). Only after the logging of d is complete, this thread schedules the task t to a node for execution and sends a message $\mathtt{ack}:< t>$ to the node which created this task.

Before a scheduler sends a task to a Maple kernel for processing, it adds a new entry to *created_tasks*. The key is the identifier of the task and the

element is an empty taskids_list. Afterwards, the scheduler puts the task identifier to the end of running_tasks or puts the task with the identifier of an external Maple kernel as a key to a hash table externUsed (depending on whether the scheduler sends the task to the primary Maple kernel or to an external Maple kernel).

Modified Result Message Handling

When a Maple kernel sends a result r in a message result: < t, r > to the local scheduler, this scheduler removes t from $running_tasks$ (see Figure 4.6b) or removes the corresponding row from externUsed (depending on whether the result message came from the primary Maple kernel or from an external Maple kernel). Then, using t as a key, the scheduler checks whether the corresponding $entry/taskids_list$ is empty in $created_tasks$. If it is empty, the system is allowed to use r and to remove this entry from the $created_tasks$ hash table. If it is not empty, the system is not allowed to use r until this entry has become empty. Therefore, the scheduler puts r with t as a key to a hash table $result_of_the_finished_tasks$.

Acknowledgement Message Handling

When a scheduler receives a message ack:< t>, it takes t and starts to look for it in $created_tasks$. More precisely, the scheduler compares t with the first element of every $taskids_list$ in $created_tasks$ (it is enough to check the first elements, because the descriptions of tasks which are created by the same node are saved sequentially and therefore the ack messages also arrive sequentially). If the scheduler finds an element which equals t, it removes it from the corresponding entry $taskids_list$. If this entry becomes empty, the scheduler removes the entry from $created_tasks$ (whose key is the identifier t' of the parent task). The scheduler checks whether there exists a result t' for t' in $tasklog_t tasklog_t tasklog$

Modified Wait/Request Message Handling

If a scheduler on a non-root node n receives a message wait:< t > from a local kernel, where t consists of a group < s, n, i > and s less than the current session identifier (task was created in a previous session), then the scheduler sends a message request:< t, n > to the root.

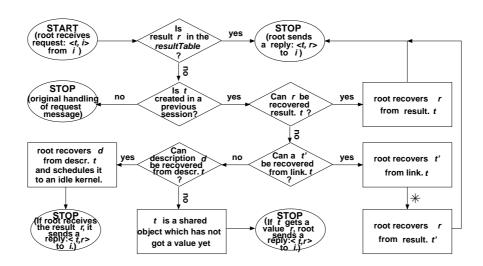


Figure 4.7: Task recovery by task identifier

When the root scheduler receives a message wait:< t > from a local kernel or a message request:< t, n > from another node, where t either was created on the root in this session or was created on any node in a previous session, it looks for the result r of t in a table result Table (see Figure 4.7). If r is located there, the root returns it either in a message result:< t, r > to the corresponding local kernel or in a message reply:< t, r > to node n (depending on where the request came from).

If r is not in resultTable and t was created in a previous session, the root scheduler tries to recover the result r from a file result.t. If r cannot be recovered from this file, the root scheduler attempts to recover it from another file result.t which is identified by task identifier t which is the content of a file link.t. (* Remark for Figure 4.7: If t can be recovered from link.t then the system does not need to check the existence and the correctness of result.t, because a link file may be created if and only if the corresponding result was already recovered successfully by its description in a previous session).

If the recovery is successful, the root scheduler sends back the result r either in a message result:< t, r> or in a message result:< t, r> to the requester. Otherwise, the root scheduler attempts to restore the task description d from file descr.t. If it is successful, the root scheduler schedules d in a message task:< t, d> to a node for execution (the requester will get r, after the root receives it in a message task:< t, t>0.

If it does not manage to recover either the description, the system treats t as an identifier of a shared object which has not got any value yet (if the identifier denotes a task, the program will consequently deadlock; this error

cannot occur when the logging was performed in Safe Mode).

4.4 Handling of Shared Objects

As mentioned in Section 3.2.5, a shared object is nothing but a result descriptor; the only difference is that a shared object t that is still empty can receives its value r by a message $\mathtt{put}:< t, r>$ that may be issued by any task knowing t.

4.4.1 Algorithm

For handling the shared objects, the logging and recovery mechanism is extended as follows:

Logging Since there is no task description d of a shared object, no hash file is written and no description file is created, if a data:< t > message is issued.

If a put: $\langle t,r \rangle$ is issued on a node different from the root, a duplicate of this message is forwarded to the root and processed analogously to the store: $\langle t,r \rangle$ messages for task results.

Recovery If the root receives a message request: $\langle t, n \rangle$ where t refers to a previous session and is destined for a shared object, it proceeds analogously to the description in Section 4.3.1 except for the following situation: if the result descriptor does not yet exist, the root creates one and records the request. If the complete result r of t is logged, the request may be immediately answered by a reply: $\langle t,r \rangle$. Otherwise, the root need not do anything because the result will be computed by another task t.

4.4.2 Implementation

A shared object has no description, its value is determined by a task issuing dist[put] command. The following activities which handle the shared objects are changed in the "Logging" mechanism.

Modified Put Message Handling

If the dist[put] command has been executed, a scheduler receives a message put: $\langle t, r \rangle$ from a local kernel. After the scheduler processed this message, it

sends a message store: $\langle t, r \rangle$ to the root. When the root scheduler receives this message, it handles it as described in Section 4.2.2.

Wait Message Handling

If the dist[get] command has been executed, a scheduler receives a message wait: $\langle t \rangle$ from a local kernel. In this case, the processing of the wait message is the same as described in case of the tasks (see Section 4.3.2).

The root scheduler cannot make a distinction between the recovery of tasks or of shared objects. This means, if it cannot restore a result of a shared object by an identifier, it tries to recover the content of the corresponding link file or description file as described in Section 4.3.2. Of course, these files exist if and only if the corresponding identifier refers to a task. So, the root does not find these files for a shared object. Therefore, the root treats the identifier as that of a shared object which has not got any value yet.

Restrictions

It is not allowed to use the dist[clear] command when the logging mechanism is switched on because the system is not capable to save and store a consistent state of the computations for the logging mechanism, when the value of a shared object changes.

Chapter 5

Tolerating Connection Failures

The previous chapter dealt with a mechanism by which a session restarted after a failure can reuse previously computed results. In this chapter (and in Chapter 6), we explain some mechanisms that enable a session to cope with some kinds of failures without aborting or deadlock.

These mechanisms handle connection failures which may occur in a Distributed Maple session. To detect this kind of failures, the already mentioned watchdog mechanism is applied both on the root and every node. Because of consequences of the FLP impossibility result [22] (see Section 2.2.1), this failure detector mechanism cannot make a distinction between the following situations:

- A connection breaks.
- A node crashes.
- A node is too slow in sending messages (the network latency is longer than the limited time period which the watchdog uses).

Therefore, we have to consider the possibility that any of these situations has occurred, when the failure detector reports a connection failure. Consequently, we chose the following strategy for handling failures in the system [8, 9, 10]. If the watchdog mechanism on a node detects that another node became unreachable, the percipient node handles the situation as a connection failure first. It closes the connection to this node and tries to establish a new connection to it.

Secondly, if the percipient node is the root and the reconnection is unsuccessful, then the unreachable node is regarded as a failed node and every message arrived from this node is rejected. If the percipient node is a non-root node and the reconnection is unsuccessful, then it attempts to connect

to the unreachable node trough the root. Later, either the root may declare the unreachable node as failed node or the percipient node may attempt to connect to this node again.

In the rest of this chapter, we explain the two mechanisms that handle connection failures: in Section 5.1 "Reconnecting with Message Acknowledging" and in Section 5.2 "Tolerating Peer Connection Failures".

5.1 Reconnecting with Message Acknowledging

In this section, we describe the "Reconnecting" mechanism of Distributed Maple. Its task is to attempt to recreate an interrupted connection between the root and any other node and to resend lost messages. For achieving this goal, this mechanism introduces a message acknowledging mechanism.

In practice, the "Reconnecting" mechanism is called after the root detects that a node has become unreachable, but before the "Tolerating Non-Root Node Failures" mechanism described in Section 6.1 is applied.

5.1.1 Assumptions and Guarantees

For using the "Reconnecting" mechanism, the following conditions have to be satisfied:

- communication is reliable (we suppose messages never become corrupted or duplicated and messages are lost only in case of connection failures), and
- no Byzantine failures occur.

The benefit of the "Reconnecting" mechanism is that if the reconnection is successful then the tasks which have already been scheduled to the reconnected node do not need to be rescheduled to another node and their started (and perhaps finished) processing does not have to be repeated (unlike the "Tolerating Non-Root Node Failures" mechanism). If the reconnection is unsuccessful, the "Tolerating Non-Root Node Failures" mechanism can still be called.

In other words, a session is able to reduce the loss of resources in some kinds of failure situations by the "Reconnecting" mechanism. Furthermore, the message acknowledging mechanism introduced by this mechanism is indispensable for the accomplishment of the "Tolerating Root Failures" mechanism described in Section 6.3.

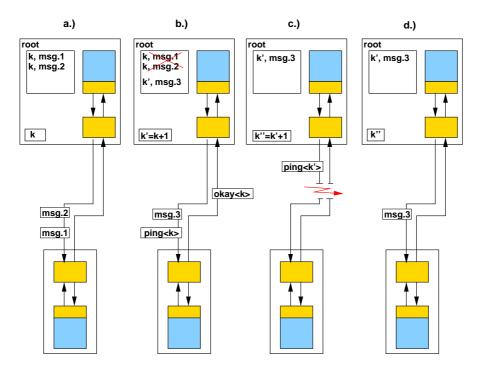


Figure 5.1: a.) and b.): Message Acknowledging c.) and d.): Resending of not Acknowledged Messages after Reconnection

5.1.2 Algorithm

A necessary condition to detect this kind of failure is that the root cannot contact some node for a certain period of time. We thus let the root use the watchdog mechanism (see Section 3.2.3). By this, the root checks periodically the connection to every node even as the non-root nodes check their connections to the root.

If a node i observes that the root has become unreachable, it waits for a connection request from the root for a limited time period. If the request does not arrive, i shuts itself down. When a root observes node i becomes unreachable, it tries to reconnect to i in the same way in which a node creates a peer connection to another node during normal execution. If it does not get back any reply, then it starts the "Tolerating Non-Root Node Failures" mechanism (see Section 6.1). If i receives a connection request from the root, it sends back a positive acknowledgement (independently whether it has already observed the connection failure or not).

There is a problem that the root and the reconnected node i now have to deal with: the management of those messages that were sent and might be lost. For solving this, the root can resend some task, result and wait messages

to node i, and node i can resend some task, result, store and wait messages to the root. The root also deals with those messages which were sent through it to i by any other node. All other nodes (except the root and i) are not affected by a connection failure in case of successful reconnection.

For resending the corresponding messages, every node maintains a set M_j , which contains all messages sent to j (see Figure 5.1a). On the root, this set contains also those messages which were sent by any other node to j through the root. For a subset M_j^a , acknowledgements have already arrived from j (see Figure 5.1b). For acknowledging these messages, the system uses the modified ping message and its acknowledgement. Namely, if the number of non-acknowledged messages reaches a certain bound in M_j , a ping: $\langle k \rangle$ message is sent and the set $M_{j,k}$ becomes $M_j - M_j^a$ where k uniquely identifies this ping: $\langle k \rangle$ message (such a message is also sent in the original case, see Section 3.2.3). If an acknowledgement arrives with index k, every element of $M_{j,k}$ is added to M_j^a . After j has been reconnected, each message in $M_j - M_j^a$ has to be sent again (see Figure 5.1c and d).

Since it may occur that a message reaches its destination, but it has never been acknowledged due to a connection failure, some messages may arrive twice after a reconnection. This is not a problem, because the system tolerates redundant messages.

5.1.3 Implementation

The first step for achieving the "Reconnecting" mechanism is to start a new watchdog thread on the root similarly as on the non-root nodes. By this thread, the root is able to check the reachability of non-root nodes. Furthermore, we have to take care of the following issues during the implementation:

- A non-root node has to be able to accept a connection request from the root at any time even if it has not detected any connection failure yet.
- After a successful reconnection, the set of messages which are lost due to a connection failure between the root and a node has to be determined in a session.

New Data Structures and Messages

• **PingId** is an integer variable. On every node *i*, this variable is assigned to each connection via which *i* interacts to another node and it is always initialized with 0 after the corresponding connection is established. This variable is used as a counter to generate unique identifiers for **ping** messages sent to the same node.

- The new version of the message **ping**:<index> has an argument index which uniquely identifies the message.
- Originally, okay messages are used for acknowledging of ping messages. The new version of the message okay: < index > has an argument index, with which the acknowledged ping message can be identified.
- A **MsgRegistry** is a hash table whose keys are numbers which identify **ping** messages and whose elements are lists of messages. On a node *i*, such a hash table is assigned to each connection via which *i* interacts to another node.
- A message **reconnection**:<*i*> can be sent only locally to the server thread either by the watchdog thread on the root or by the connect thread on a non-root node. The server thread on the root receives such a message if and only if the watchdog thread detects that a node has become unreachable. A server thread of a non-root node receives this message if and only if the root has already reconnected to it The argument *i* is the identifier of the unreachable node.

Initialization of Data Structures on a Root

During a session initialization, an empty hash table MsgRegistry is created to each connected node.

A watchdog thread is started if and only if this mechanism is activated. This can be done by the call dist[logging] (4) (see Section 7.1).

Message Acknowledging

As mentioned in Section 3.2.3, the couple of ping and okay messages are originally used by the watchdog mechanism. A message ping is sent if any message has not arrived from a connected node for a limited period of time. This message is always acknowledged with a message okay by a connected node. Since the sequence of the messages sent via a connection cannot be changed, the ping and okay messages can be used for acknowledging received messages as follows.

For this, a variable pingId and a hash table MsgRegistry is assigned on node i to each connection via which i interacts with another node j. Before a message (different from ping and okay) sent to j, the current value of pingId is used as a key to store the message in MsgRegistry (see Figure 5.1a).

A message ping: < index > is sent to j if either any message has not been recently received from j (original purpose) or the number of messages in

MsgRegistry reaches an upper limit. The value of its argument index comes also from the current value of pingId, but then pingId is incremented (see Figure 5.1b).

If node j receives a message ping:<index> from i, j simply returns index in a message okay:<index> to i. When this okay message arrives at i, the list of messages which is stored with index as a key in MsgRegistry is removed (see Figure 5.1b).

In case of a successful reconnection, it is enough to resend those messages which are contained by the corresponding MsgRegistry (i.e., which have not been acknowledged by the reconnected node, see Figure 5.1 c and d).

Modified Watchdog Thread

If a watchdog thread on a non-root node detects that the root became unreachable, it waits for a connection request from the root for a limited time period. If the request does not arrive, the node aborts.

If the new watchdog thread on the root detects that a node i became unreachable, it sends a message reconnection< i> to the server thread.

Modified Connect Thread

If a connect thread of a node receives a connection request from the root, it sends a message reconnection < rootId > to the server thread of the node. Its argument rootId denotes the identifier of the root.

Reconnection Message Handling

When the server thread of the root receives a message reconnection: $\langle i \rangle$, it first informs the user about the failure. Then it attempts to recreate the connection to node i in the same way in which a non-root node creates a peer connection to another node during normal operation. If i does not respond to this connection request, the root performs "Tolerating Non-Root Node Failures" mechanism on i (see Section 6.1). If the connection to i is reestablished, the root increments the corresponding pingId. Then, it takes and deletes all messages from the corresponding MsgRegistry and resends them to i.

If a server thread of a non-root node receives a message reconnection: < root Id >, it simply resends the non-acknowledged messages to the root, similarly to the root.

5.2 Tolerating Peer Connection Failures

The connection between two non-root nodes is called peer connection. Such connections are established on demand during the execution. By the "Tolerating Peer Connection Failures" mechanism, a session is capable to cope with peer connection failures without overall failure. The principle is simple: if a non-root node cannot send a message to another such node, it sends this message to the root which forwards it to the final destination.

This mechanism uses the same message acknowledging mechanism for resending lost messages as the "Reconnecting" mechanism (see Section 5.1).

5.2.1 Assumptions and Guarantees

The "Tolerating Peer Connection Failures" mechanism requires the following assumptions:

- communication is reliable (we suppose messages never become corrupted or duplicated and messages are lost only in case of connection failures),
- no Byzantine failures occur, and
- either connections never fail between root and non-root nodes or the "Tolerating Non-Root Node Failure" mechanism is switched on (see Section 6.1).

In practice, the "Tolerating Peer Connection Failures" mechanism is never used without the "Tolerating Non-Root Node Failures" mechanism. Therefore, we must take over an additional assumption, which is still required for the working of this other mechanism (see Section 6.1.1). This supposes that the root node has an ability to access to a reliable storage system.

If the system satisfies these conditions, the "Tolerating Peer Connection Failures" mechanism guarantees: if some peer connections between non-root nodes break, then the system is able continue normal operation without any deadlock situations (by resending of the corresponding messages through the root).

5.2.2 Algorithm

The watchdog mechanism located on every non-root node is also used to check regularly the peer connection between these nodes. If a node i detects that another node j became unreachable to i via a peer connection, i attempts

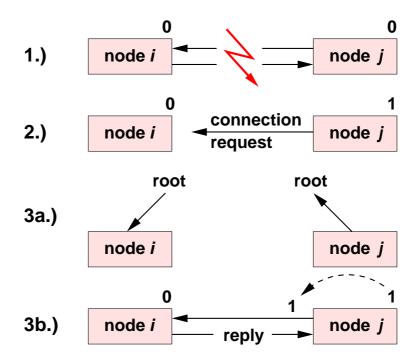


Figure 5.2: Handling of Peer Connection Failure

to establish a new peer connection to j in order to resend the messages to j, which might be lost (see Figure 5.2). To determine the set of such messages, the same message acknowledging mechanism is used like in "Reconnecting" mechanism (see Section 5.1.2).

- If j does not respond to the connection request of i in a certain time, all messages which must be delivered from i to j are sent through the root for a certain time (then i may attempt to contact j again).
- If j responds to the connection request of i in time, i sends to j the number of detected connection failures between itself and j. If this value is greater than the number of connection failure detected by j between j and i, then j recognizes that j has not detected a connection failure yet. Hence, j also resends the not acknowledged message to i.

If nodes on both sides of a peer connection observe a failure of the connection roughly at the same time (and both of them tries to connect to the other one), then it may occur that two pieces of one way connections are established.

5.2.3 Implementation

The "Tolerating Peer Connection Failures" mechanism is based on an extended version of the watchdog mechanism originally available in Distributed Maple (see Section 3.2.3). Namely, the non-root nodes check the connections between each other with the same strategy in this new watchdog version as they have already checked their connection to the root in the previous version, too.

In the course of the implementation of the "Tolerating Peer Connection Failures" mechanism, we took care of the following cases:

- In contrast to the connections between root and non-root nodes, the peer connections are established during the execution, if they are needed. Therefore, the system has to be able to check, whether a connection is created successfully.
- If the establishing of a peer connection was unsuccessful, the corresponding two non-root nodes have to interact via the root.
- If the establishing of a peer connection was unsuccessful, the corresponding non-root nodes may try it again after some time.
- If a peer connection breaks, both non-root nodes have to become aware of this.
- The non-root nodes have to determine which messages might be lost due to a peer connection failure.

Furthermore, we had to investigate the situation in which a node fails but a non-root detects this event earlier than the root and it tries to resend the lost messages through the root. In that case, if the root does not detects the node failure before it receives these messages it forwards them. Otherwise, it simply does not deal with them. Of course these message are lost (again) in both cases. Eventually the root detects the node failure and among others these lost messages are handled and resent again as described in Section 6.1. Thus some redundancy may occur in such a situation, because some messages might be resend twice.

New Data Structures

• **peerConnections** is a bit set, which is located in every non-root node. Each bit in this data structure belongs to a possible peer connection to

another non-root node. If a peer connection is created between two non-root nodes, then the corresponding bit is set on both nodes. If a non-root node i observes that a peer connection is broken, the corresponding bit is cleared in peerConnections on i.

- currentPeers is a bit set, which is located in every non-root node. Each bit in this data structure belongs to a possible peer connection to another non-root node. From time to time, its content is synchronized to the content of peerConnections. A non-root nodes checks only those existing peer connections by watchdog mechanism whose bits are set in currentPeers. If a non-root node i detects that a peer connection broke, the corresponding bit is cleared in currentPeers on i.
- status is a hash table whose keys are non-root node identifiers and whose elements are integer values. If such a value is 0, messages may be sent directly to the corresponding non-root node via peer connection. If such a integer value is greater than 0, messages are sent to the corresponding non-root node through root.
- numberOfFailures is a hash table whose keys are non-root node identifiers and whose elements are integer values which show how many times the peer connection to the corresponding non-root node broke. If a non-root node observes that another non-root node has become unreachable via peer connection, the non-root node increments the corresponding value in this data structure. When a new peer connection is established, the corresponding values of these two non-root nodes are compared. If they are not equal, one of non-root nodes does not observe the peer connection failure between this two nodes.
- A message **brokenpeer**: $\langle i \rangle$ is sent if a non-root node observes that one of non-root nodes became unreachable via peer connection. The argument i is the identifier of the unreachable non-root node.
- **sockets** is a hash table whose keys are non-root node identifiers and whose elements are references to those sockets via which a node interacts with other nodes.
- inThreads is a hash table whose keys are non-root node identifiers and whose elements are references of input threads which handle the arriving messages from the corresponding non-root nodes.
- A message **outclose** is sent if a node intends to stop one of its output threads. The corresponding thread does not deliver this message, but it finishes its own execution.

Activating of Tolerating Peer Connection Failures

The "Tolerating Peer Connection Failures" mechanism can be switched on together with the "Tolerating Non-Root Node Failures" mechanism by the call dist[logging](3).

If this mechanism is activated, a variable pingId and a hash table MsgRegistry is initialized for all established peer connections and the messages sent via such connections is acknowledged with the message pair ping: <index> and okay: <index> even as in the "Reconnecting" mechanism (see the description of pingId, MsgRegistry and message acknowledging in Section 5.1.3).

Modified Message Sending Protocol between Nodes

When a non-root node i wants to send a message to another non-root node j, i tries to sent it directly via a peer connection. If such a connection has not existed between i and j yet and the value referred by j in the hash table status is equal to 0, then i sends a connection request to an announced communication port of j, on which the $connect\ thread$ of j is listening (see Figure 5.2).

• If the peer connection is established successfully between i and j, both nodes exchange their identifiers between each other first in order to identify themselves.

Then i, which issued the connection request sends to j the corresponding value from the hash table numberOfFailures located on i. The connect thread on j compares this received value with another one referred by i in the hash table numberOfFailures located on j. If the received value is the greater one (which means a previous peer connection between i and j failed, but j has not detected it yet unlike i), then the $Closing_Peer$ operation is called with i as an argument by j.

Afterwards, both nodes set the corresponding bit in their own bit sets peerConnections. At last, they start input threads and output threads belonging to the created peer connection and they put references to the related socket and to the newly started input threads to their hash tables sockets and inThreads. A message can be sent via this peer connection only after this procedure.

• If node j does not respond to the connection request of i during a limited time, i sends the message to j through the root and it sets the corresponding value of the hash table status to a positive number. This implies that every message sent from i to j will be delivered through the root until the value referred by j as a key in status become 0 again.

• If the value referred by j in status is greater than 0, i simply sends the message to j through the root

Modified Watchdog Thread

The new watchdog thread of non-root nodes extends the activity of the original watchdog, such that it periodically checks an existing peer connection if the bit assigned to this connection in the hash table *currentPeers* is set. Namely, the action of a watchdog thread is split to time periods. When such a time period starts, the watchdog thread synchronizes the content of *currentPeers* to the content of *peerConnections*. Hence, during a time period, the watchdog thread waits for messages via only those peer connections (or forces a reply via them at least) which were established in a previous watchdog period (in other words, each connected non-root node has at least one such a time period to send some message via a new created peer connection).

If a watchdog thread detects that a non-root node j became unreachable via peer connection, it simply calls the Closing_Peer operation with j as an argument.

After the checking of all peer connections in a watchdog time period, the watchdog thread decrements all those values contained in *status* which are greater than 0.

Closing_Peer Operation

This operation is called with an argument j after a peer connection failure either by the watchdog thread if it detects that a non-root node j has become unreachable or by the connect thread due to a connection request from j. To avoid to apply this operation to the same broken connection twice (which may cause deadlock), the value of the bit j in bit set peerConnections is investigated first. If the checked bit is cleared, the $Closing_Peer$ operation returns. Otherwise, it clears the checked bit in peerConnections and the same bit in currentPeers, too (the Closing_Peer operation is encapsulated and it can be invoked by only one thread at the same time).

Then it increments the corresponding value referred by j in numberOf-Failures. It closes the communication channel to j by using the corresponding references stored in hash tables sockets and inThreads and by sending a message outclose to the corresponding output thread. Finally, this operation sends a message brokenpeer: $\langle j \rangle$ to the server thread.

Brokenpeer Message Handling

When a non-root node i receives a message brokenpeer: $\langle j \rangle$, it forwards this message to the root and resends to j those messages from the corresponding MsgRegistry which have not been acknowledged yet (like in the case of "Reconnecting" mechanism, see Section 5.1.3).

When the server thread of the root receives a message brokenpeer:< j > from a node i, it informs the user of that i cannot interact with j via peer connection.

Chapter 6

Tolerating Node Failures

In this chapter, we introduce some fault tolerance mechanisms to avoid a session failure in case of the failure of any node (even if the root). Furthermore, we present a simple algorithm by which a session is able to restart failed nodes in order to reduce the loss of resources.

Lots of systems [5, 37, 36] which provide automatic restart and recovery in response to node failures use *checkpointing*. This is a generally usable and stable algorithm, but it is not efficient enough (e.g.: the execution phase is periodically interrupted by checkpointing phase in normal operation, the whole session has to return to the last checkpoint after a node failure, etc). Furthermore, this mechanism is not able to tolerate server (or root) failure without overall failure.

One possibility to achieve tolerating server (or root) failure without session failure is to apply some kind of *leader election* algorithm. If the server fails, one of the other session members is elected as the new server. The problem with such approaches is that most leader election algorithms were developed only for synchronous distributed system or had assumptions that were too strong for real-life applications [41] (e.g.: that links between nodes never fail). If the new server is selected, a distributed session can be restarted from a consistent state.

To our knowledge, the *Invitation Algorithm* made by Garcia-Molna for asynchronous distributed systems [25] comes closest to our research (for more details see Section 2.2.3). But this algorithm still cannot handle the situation in which a session/network is split to two or more parts. In such a case, a group of the nodes which lost the connection with the original server triggers a server election (there may exist more than one server at the same time). Moreover, an analysis of the Invitation Algorithm [69] shows that its specification is undesirably strong: in some situations, it requires that a connection between two nodes never fails.

In Distributed Maple, the applied functional task model helps a lot for simplifying the problem of node failures, because we have to restart only those tasks which were under processing on the failed node [64, 65, 8] (and of course resend the lost messages). Hence, the whole session does not have to interrupt its execution and can return to a stored consistent state of it.

The case of root failures is not so simple. We also developed a leader election algorithm to choose a new root from the pool of non-root nodes after a root failure was detected [9, 10]. However, in contrast to the Invitation Algorithm, no situation may occur in which there exist more than one root at the same time. If the new root is elected, the features of the functional task model and of the "Logging" mechanism facilitate to set a consistent state of the new root (without stopping the whole execution and returning to a stored state of the session).

In the rest of this chapter, we present and describe three mechanisms: in Section 6.1 "Tolerating Non-Root Node Failures", in Section 6.2 "Restarting after Node Failures", and in Section 6.3 "Tolerating Root Failures".

6.1 Tolerating Non-Root Node Failures

In this section, we sketch a mechanism that enables a session to cope with non-root node failures without aborting (the root continues operation with the remaining nodes).

6.1.1 Assumptions and Guarantees

For using the "Tolerating Non-Root Node Failures" mechanism, we assume that the Safe Mode of "Logging" mechanism described in Section 4.3 is switched on and works correctly. Namely, if a non-root node becomes unreachable, the root restores the corresponding logged task descriptions from the storage system in order to reschedule them to other nodes. (The Safe Mode guarantees, that every task description is saved to the storage system, before it is scheduled.)

This means, we also use all the assumptions here which we have already for the proper functioning of logging mechanism in Section 4.1:

- access to a reliable storage system,
- reliable communication (we suppose messages never become corrupted or duplicated, but we do allow to lose messages in case of connection break),

• no Byzantine failures.

If the system meets these conditions, this mechanism guarantees:

- all guarantees of the Safe Mode and
- even if some non-root nodes fail or some connections between the root and a non-root node break permanently, then the system is able to continue normal operation (by rescheduling of the corresponding tasks and resending of the corresponding messages).

Furthermore, we must also mention that the application of the functional task model in the system permits the continuous processing of scheduled tasks on faultless nodes even if a node failure is detected and tolerated in a session.

6.1.2 Algorithm

As mentioned in Section 5.1, the root regularly monitors the connection to each node by watchdog mechanism. If a node becomes unreachable to the root and the root cannot contact to it by the "Reconnecting" mechanism, then this mechanism is started.

First of all, the "Tolerating Non-Root Node Failures" mechanism declares the unreachable node dead (see Figure 6.1). However, this does not necessarily mean that the node is actually dead; it may be slow in responding, the connection to the root may have been transiently interrupted, or the connection to the root is permanently broken but connections to other nodes still exist. We therefore must assume that even a dead node still may send messages to the root or to any other node. Thus, when the root designates a node as dead, it informs all other nodes correspondingly: every node closes the connection to the dead node and ignores any remaining messages from this node (such messages may arrive between the handling of the notification and the closing of the connection).

There are two main problem that the root now has to deal with:

- 1. the management of all result descriptions that have been stored on the dead node, and
- 2. the rescheduling of all tasks that were executing on the node at the time of its alleged death.

Since the root is in charge of task scheduling, the root sees every task created in the session. Furthermore, by the logging mechanism discussed in Section 4, the root sees every result computed in the session. For every node n, the root can therefore maintain two sets T_n and S_n :

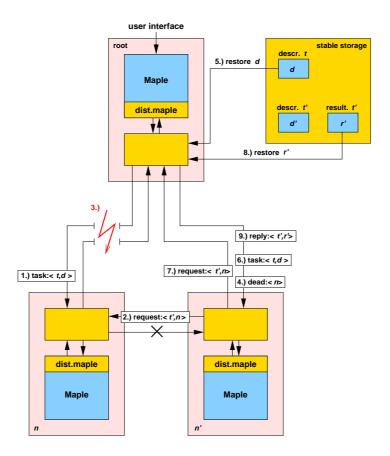


Figure 6.1: Tolerating Non-Root Node Failures

- 1. T_n denotes all tasks scheduled on n; for a subset T_n^r the results are available (in the logging files). All tasks in $T_n T_n^r$ have to be executed again; the root puts them back into the pool of tasks to be scheduled for execution.
- 2. S_n denotes all tasks or shared objects whose descriptions are stored on n; for subset S_n^r the results are available (in the logging files). The root becomes the owner of elements in S_n; it allocates the corresponding result descriptors and, for all elements of S_n^r, fills them with results. Subsequently, every node will send requests for a result in S_n to the root. However, there may be still outstanding requests sent to n but not yet answered at the time of its death. Every node n' therefore holds a table R_n of all request: <t,n'> messages sent to node n but not yet answered by a reply: <t,r>. When n is marked dead, the node resends all messages in R_n to the root which will eventually answer them.

Thus all tasks scheduled on an eventually dead node n are executed (pos-

sibly on a different node n') and every descriptor originally housed by n finds a new home on the root to which all open and all future requests are redirected.

6.1.3 Implementation

The "Tolerating Non-Root Node Failures" mechanism is based on the watchdog mechanism originally available in Distributed Maple. This means, the root checks periodically all nodes. If a non-root node does not send any message to the root during a limited time period, the root thinks, the node became unreachable. In the course of design of this mechanism, we took into consideration that watchdog mechanism cannot make a distinction between the following situations (as discussed in the beginning of Chapter 5):

- A non-root node crashes.
- The connection between the root and a non-root node breaks.
- The answer from a non-root node arrives too late (the network latency is longer than the limited time period which the watchdog uses).

If the root interrupts the connection to a node (maybe, it tries first to reconnect to the node by "Reconnecting" mechanism described in Section 5.1, if this mechanism is activated), but the node is still alive, the node will abort after some time.

When the root observes that a node became unreachable, it reschedules those tasks which were scheduled on the node and sends a broadcast to all other nodes. Due to this broadcast, all nodes (the root and the others) resend those messages to the root which might be lost. Namely, the task results which were located on the unreachable node are restored and provided by the root.

New Data Structures and Messages

- **crash** is a hash table whose keys are non-root node identifiers and whose elements are boolean values which show the states of a non-root node. If a value is false, the corresponding node lives. If a value is true, the corresponding node became unreachable.
- **sockets** is a hash table whose keys are non-root node identifiers and whose elements are references to those sockets via which the root or a node interacts with other nodes.

- inThreads is a hash table whose keys are non-root node identifiers and whose elements are references of input threads which handle the arriving messages from the corresponding non-root nodes.
- A message **outclose** is sent if a node intends to stop one of its output threads. The corresponding thread does not deliver this message, but it finishes its own execution.
- scheduled_tasks is a hash table whose keys are node identifiers and whose elements are lists of task identifiers which are scheduled for processing to the corresponding node. This data structure is located only in the root.
- A message **dead**: $\langle i \rangle$ is sent if the watchdog of the root observes that one of nodes became unreachable. The argument i is the identifier of the unreachable node.

Initialization of Data Structures on a Root

During a session initialization, the root puts for each newly established connection the references to a socket and to the corresponding input thread to a hash tables *sockets* and *inThreads*. It also inserts a value "false" with an identifier of each connected node as a key into a hash table *crash*.

An empty hash table *scheduled_tasks* is created and a watchdog thread is started if and only if this mechanism is activated. This can be done by the call dist[logging](3) (see Section 7.1).

Initialization of Data Structures on Nodes

A hash table *crash* is filled up with value "false" for every non-root node on each non-root node at the time of the session initialization.

As written in Section 3.2.2, if a non-root node intends to send a message to another non-root node via a peer connection, but such a connection does not exist between these two nodes yet, then it is created. After such a connection has been established, the nodes on both sides put references to the related socket and to the corresponding input thread to the hash tables sockets and in Threads.

Modified Task Scheduling

Before the root schedules a task in a message task: < t, d > to a node i, it puts the task identifier t with node identifier i as a key to a hash table $scheduled_tasks$ (see Figure 6.2a).

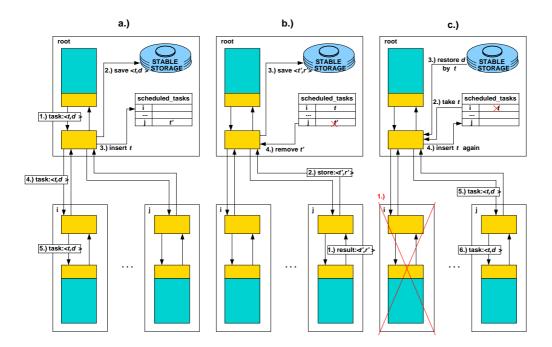


Figure 6.2: a.) Task Scheduling b.) Result Logging c.) Rescheduling

If the root receives a message store: < t', r' > from a node <math>j, it logs the received result r' and removes the task identifier t' from hash table $scheduled_tasks$ by using j as a key (see Figure 6.2b). If the root does not find t' in the corresponding row of hash table $scheduled_tasks$, then t' denotes a shared object.

Then the root checks whether any received message wait:< t'> or message request:< t', n> has already waited for the result r'. If such a request has arrived, it sends back r' (namely, if the node which emitted the task t' fails, then all requests related to r' are forwarded to the root).

Dead Message Handling

By the watchdog thread of the root, the root monitors the nodes. If this thread detects that a node i became unreachable, it sends a message $\mathtt{dead}: < i >$ to the server thread of the root (but only after an unsuccessful reconnection to i, if the "Reconnecting" mechanism has been activated, see Section 5.1).

When the server thread of the root receives a message $\mathtt{dead}:< i>$, it first informs the user about the failure. Then it closes the communication channel to i by using the corresponding references stored in hash tables sockets and inThreads and by sending a message $\mathtt{outclose}$ to the corresponding output thread. Then it adjusts the corresponding line in hash table crash to a

value "true" by using i as a key and it broadcasts message dead: $\langle i \rangle$ to all reachable nodes.

Afterwards, the root checks in hash table $scheduled_tasks$ whether any task was under processing on node i, restores the descriptions of such tasks from the storage system and reschedules them (see Figure 6.2c).

Finally, it looks through stack externStack and table externWaits whether there exists any unanswered request which was forwarded to node i and sends them to itself (on every node, these two data structures contain the wait messages received from the local primary and additional Maple kernels).

If a non-root node receives a message $\mathtt{dead}:<\!i>$, it checks whether it has a peer connection to node i. If yes, it closes the socket of this connection and stops the input threads belonging to it by using the references in hash tables sockets and inThreads (the corresponding output thread is also stopped by sending a message $\mathtt{outclose}$). It also put a value "true" with i as a key to hash table crash. Finally, similarly to the root, the node resends the unanswered wait messages to the root which were sent to node i.

Modified Communication Protocol

Before the root broadcasts a message, it checks in hash table *crash*, which nodes live and sends the broadcast message only to them.

Before sending a result message to a non-root node, it is checked whether the node is reported as unreachable. In this case, the message is not sent.

If a node wants to send a request message to an unreachable node, then it sends it to the root. When the root receives a request message or a wait message with a task identifier created by an unreachable node, it tries to restore its result from the storage system. If this is not possible, the root will eventually receive an answer by a store message and then send an answer.

6.2 Restarting after Node Failures

We have implemented a quite simple mechanism by which the root may attempt to restart the crashed or aborted nodes.

6.2.1 Assumptions and Guarantees

It does not make sense to use the "Restarting" mechanism without the "Tolerating Non-Root Node Failures" mechanism. Therefore, we reckon the "Restarting" mechanism as some kind of extension of the "Tolerating Non-Root Node Failures" mechanism.

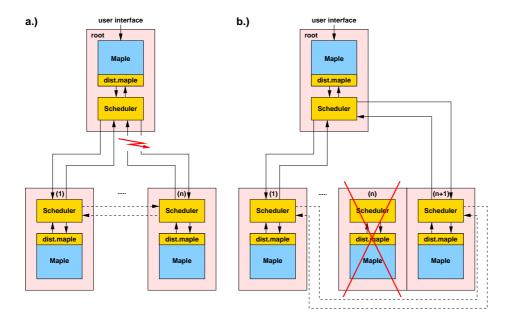


Figure 6.3: a.) A node becomes unreachable to the root. b.) The root restarts the node with new identifier. If the unreachable node still alive, it eventually aborts.

Accordingly, we can use the same assumptions for this mechanism which we use for "Tolerating Non-Root Node Failures" mechanism described in Section 6.1.1. No more assumptions are needed (nevertheless, if we want to use the "Restarting" mechanism together with the "Tolerating Root Failures" mechanism, then an additional restriction has to be introduced, see in Section 6.3.1). The benefit of the "Restarting" mechanism is that it minimizes the loss of resources (nodes) during an execution.

6.2.2 Algorithm

After the unsuccessful reconnection to node i, the "Tolerating Non-Root Node Failures" mechanism is started. The root also starts an asynchronous thread to try to restart eventually i in the same way as in initial phase (see Figure 6.3). If this is managed, node i gets a new identifier instead of i, because all the results that have been stored on i earlier are provided by the root during the rest of the execution. The targets of the wait messages have to be determined uniquely from the node identifier contained in the task identifier.

By changing the identifier of the restarted node, we can guarantee that all other nodes interact to the newly started node. Namely, if node i did not fail, just disconnected to the root, it may send some messages to some other nodes. But in this case, these nodes simply drop these messages (because

i is declared dead by "Tolerating Non-Root Node Failures" mechanism). i eventually aborts.

6.2.3 Implementation

The central element of this mechanism is a concurrent thread on the root, called *restarter thread*. If a node is designated as dead, this thread periodically contacts to the server thread to attempt to start a new node instead of the unreachable one on the same machine. To achieve this, we had to take care of the following issues:

- If processes of a disconnected node (which was designated as dead) and a newly started one run on a machine at the same time, then all other node must not contact the dead node instead of the new one.
- After a node has been restarted, there are two possibilities to continue normal operation. The first is that the last consistent state of the node is restored effectively to the node (this implies the reloading of those task results to the restarted node which were stored on this node earlier and which are served currently by the root). The other way is that the tasks created newly on the restarted node are distinguished (and handled separately) from those tasks that were created also on this node before its failure (these tasks have already been migrated to the root). We chose the second solution.
- The activities of the server thread and restarter thread have to be synchronized. Otherwise, it may occur that the restarter thread triggers the restarting of a node, before the previous restarting operation of that node (successfully or unsuccessfully) has finished. In such a case, more than one node may started with the same node identifier on the same machine.

A simply and effective solution for the first two issues as mentioned already is to give a new and unique identifier for the restarted node (or in other words, starting and initialization another node instead of the failed one on the same machine).

New Data Structures

• starting_flags is a hash table whose keys are identifiers of dead nodes and whose elements are boolean values. If a value "true" means a

restarting attempt of a node has already been triggered, but not finished. By this data structure, a kind of synchronization is achieved between the server thread and the restarter thread.

Activating Restarting Mechanism

The user can switch on the "Restarting after Node Failures" mechanism together with the "Reconnecting" mechanism by the call dist[logging](4).

Insert Operation

After a node *i* is designated as dead, the server thread on the root calls the Insert Operation of "Restarting" mechanism. This puts a value "false" with *i* as a key to a hash table *starting_flags* and checks whether the restarter thread has already been started. If it does not run yet, this operation starts it.

The Restarting

If the restarter thread is started, it waits for a bounded time period. Then it selects those keys (or node identifiers) from the hash table *starting_flags* whose values are "false". By using these selected identifiers as keys, it looks for a machine name (or an IP address) and a system type for each of them from hash tables *name* and *system* (in Distributed Maple, among others these two data structures are used for storing session initialization information).

The restarter thread sends these tuples of machine names and system types in messages start:<name, system> to the server thread (in Distributed Maple, start messages are originally used only for establishing and initialization nodes at session initialization phase). Finally it sets the referred values of the selected node identifiers to "true" in hash table starting_flags and it starts to repeat its activity from the beginning.

The server thread handles start messages received from restarter thread in the same way as at session initialization, except some minor changes:

- If the server thread received a start message from the restarter thread, but reestablishing of a node *i* is unsuccessful, then it adjust the referred value of *i* to a "false" in hash table *starting_flags*.
- If the server thread received a start message from the restarter thread, and reestablishing of a node is successful (this operation guarantees that the (re)started node gets a new and unique identifier), then it informs the user about the successful restarting and calls the Remove Operation of the "Restarting" mechanism. At last, it activates the corresponding

fault tolerance mechanisms on the restarted node by sending a message stable: < mode> and it initializes the restarted node by sending every message all: < command> issued already in the session (in Distributed Maple, these all messages are stored in a list allMessages on every node and they are originally used for initialization of additionally created Maple kernels).

Remove Operation

After a node *i* has been restarted successfully, an operation is started, which removes the corresponding line from the hash table *starting_flags* by using *i* as a key. If *starting_flags* becomes empty, this operation stops the restarter thread.

6.3 Tolerating Root Failures

This mechanism is able to change the root node such that a session may tolerate the failure of the root without overall failure. We achieved this root fault tolerance by developing and applying a new *leader election* algorithm for our asynchronous distributed system. In this algorithm, one or more distinguished nodes with some special properties (in a general case, all nodes may have such properties in a session) are able to substitute for the root.

6.3.1 Assumptions and Guarantees

The "Tolerating Root Failures" mechanism is based on all already mentioned fault tolerance mechanisms ("Logging", "Tolerating Non-Root Node Failures", "Tolerating Peer Connection Failures" and "Reconnecting") except "Restarting after Node Failures". Therefore, the same assumptions are made as were described for the previous mechanisms: a reliable and stable storage system, reliable communication, no *Byzantine* failures and only *Stop* failures may occur. There are two more important assumptions. First, the storage system is independent from the root and at least one non-root node has access to it. Second, the description of the main task which is performed by the root kernel is initially stored by this storage system.

At no time during the execution of the system, there may exist more than one root. If the root becomes unreachable to another node, this means either the root crashed (see Figure 6.4a) or the connection between the root and the node broke (see Figure 6.4b, c and d). In the second case, the system has to be able to decide about the election of a new root. To guarantee this, the current root always has to be connected to n/2 nodes at least (see Figure

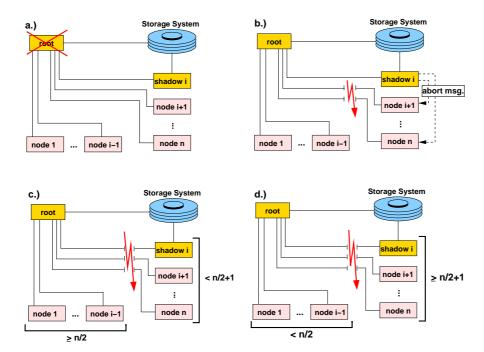


Figure 6.4: a.) The root crashes. b.) The connections between the root and some non-shadow nodes break c.) The network is split. The root is connected to at least n/2 pieces of non-root nodes. d.) The network is split. The shadow node is connected to at least n/2 pieces of non-root nodes.

6.4c); a non-root node may become the root if and only if at least n/2 non-root nodes (beyond itself) accept it as the root (see Figure 6.4d), where n is the initial number of the non-root nodes.

It is possible to use the "Restarting after Node Failures" mechanism together with this mechanism, but the additional restriction is needed: an unreachable node may be restarted if and only if the root has declared it dead (see Section 6.1) and more than n/2 nodes have acknowledged this declaration (the "Tolerating Node Failures" mechanism warrants that every message from a dead node is dropped).

If the system satisfies the conditions and restrictions mentioned above, we guarantee the following:

- If the root node crashes, then the system is able to continue normal operation such that a non-root node becomes the new root (see Figure 6.4a).
- If less than the half of number of non-root nodes become unreachable to the root, the system is able to continue normal operation. The lost

nodes may be restarted later by the "Restarting after Node Failures" (see Figure 6.4c).

- If more than the half of number of non-root nodes disconnect permanently from the root and there is at least such a node among these nodes that has access to the storage system, then the system is able to continue normal operation such that a non-root node becomes the new root. If the previous root is still alive, it eventually aborts (see Figure 6.4d).
- If the system/the network is split to more than two almost equal parts, where neither the root nor one of the shadow roots can connect enough nodes, then each node aborts.

Furthermore, we would like to emphasize one more advantageous feature of our root fault tolerance mechanism. Namely, the processing of scheduled tasks on faultless nodes is never interrupted or suspended due to a root failure and a root election. It can be possible, because the parallel programming model of the system is based on functional tasks.

6.3.2 Algorithm

At the initialization of the session, all nodes get the identifier of a special non-root node which can access the storage system. This node is called shadow root or simply shadow. The subsequent explanation assumes first that there is only one such shadow. In the last part of this section, we will generalize the mechanism to an arbitrary number of (potential) shadows.

Triggering the Root Election If the root becomes unreachable to a non-shadow node k and the reconnection time expires, k sends a root_lost message directly to the shadow node i. If node i has become also unreachable, k aborts. Shadow i maintains a set R of the identifiers of all nodes that cannot contact the root. When i receives the root_lost message from k, it adds k to R. From the moment that the first node is added to R, i waits for a certain period of time. If during this period, no message arrives from the root, i starts the root election. However, if during this time a message from the root arrives (i.e. the root is not unreachable to i), the election is canceled (see Figure 6.4b). In this case, i waits until the root declares k dead (which must eventually happen since k cannot contact the root), and then it sends an abort message to k (which causes k to abort, but the root will eventually restart k). Summarizing, root election is only started in the situations illustrated in Figure 6.4 a, c and d.

Performing the Root Election Shadow node *i* broadcasts a check_root message to all live nodes except those whose identifiers are in *R*. When a node *l* receives such a message, it sends back an acknowledgement message. Node *l* also checks the root within a certain time bound. If the root is reachable to *l*, then *l* sends back a root_connected message to the shadow node *i*. Otherwise, it sends back a root_lost message to *i*.

Node i waits for the acknowledgement messages of the check_root broadcast for a limited time period and counts them. If this sum plus the size of R is less than n/2 where n is the initial number of the nonroot nodes, i aborts (see Figure 6.4c). Otherwise, it waits further for root_lost and root_connected messages and counts them, too. If it receives a root_lost message, it adds the identifier of the sender to R (if i observes that a node whose identifier is in R became unreachable, i deletes the corresponding identifier from R). If the number of root_lost messages reaches the bound n/2, i sends a new_root message to all other nodes. If this bound has not been reached, but a root_lost or a root_connected message has been received from each acknowledged node that is reachable to i, i aborts.

Each node that has received the new_root message accepts i as the new root even if the old root is still reachable to it. Summarizing, the shadow node i becomes the new root only in cases represented in Figure 6.4a and d. In case depicted in Figure 6.4d, the old root eventually realizes that less than n/2 nodes are connected and aborts.

Initialization of the New Root After the shadow root has become the root, it loads the main task from the storage system and schedules it to its own kernel. Then it declares the old root and those nodes dead which did not acknowledge the receipt of the check_root message (when the connected nodes receive this declaration, they resend those wait messages to the new root which might be lost, see Section 6.1). After a node has accepted a new_root message, it resends all store and task messages to the new root which are not acknowledged by the old root (task messages are acknowledged by the root if and only if they have already been logged). It also sends the identifiers of those tasks in a scheduled_tasks:<task_identifiers> message to the new root which are under processing on this node. The new root keeps these pieces of information in the table *scheduled_tasks* as tuples of a node identifier and a task identifier (this table is the same which are already used by the root in the "Tolerating Non-Root Node Failures" mechanism in Section 6.1).

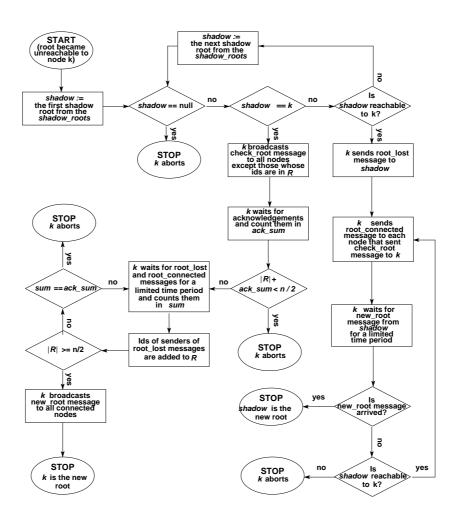


Figure 6.5: The generalized root election method on node k where n is the initial number of the non-root nodes. R is a set which consists of the identifiers of those nodes that sent root-lost message to k. |R| signs the size of R.

Task Handling and Termination If the new root receives a task: < t, d > message, the "Logging" mechanism tries to restore the result of the task from d. If it does not manage, it checks whether d may be already logged with a different identifier t. If yes, it checks whether t occurs in the table $scheduled_tasks$. If t occurs in this table, the new root drops this message, because it is already under processing somewhere. Otherwise, it schedules this task to a node.

In the normal case, when there is no root failure during the execution, the termination of the system is always triggered by user interaction. But now that the root of the session is changed, this is not possible any more (because the user interface of the system is located on the initial

root, see Figure 3.2a). Therefore, after the shadow root has become the root and its initialization is finished (all lost message are resent and all lost tasks are rescheduled), the new root investigates the content of table $scheduled_tasks$. If it is empty (which means all non-root nodes are idle) and if there is no any scheduled task on the root either, then the system terminates. Otherwise the execution continuous, but the checking of this condition is repeated every time when a store:< t, r> arrives. In a later session, the system is able to recover the result of the whole computation by the "Logging" mechanism.

Generalization of the Root Election Above description uses only one shadow node. Now, we generalize the mechanism such that we use a list of the shadow nodes. This list is called *shadow_roots*; all nodes receive it at the initialization of the session. The order of shadow nodes in *shadow_roots* is fixed.

If the root is unreachable to a node k and the reconnection time expires but the first node in the $shadow_roots$ has become also unreachable, k sends a root_lost message to the first live node in this list (see Figure 6.5). If such a node does not exist, k aborts. If k has already sent a root_lost message to a node and some check_root messages arrive from some other nodes, it replies with a root_connected messages. If k is the next shadow root, it broadcasts a check_root message as described in the previous section.

Finally, the number of the elements of R on each shadow root decides the result of the root election. In the worst case, neither shadow node becomes the root and the whole system aborts.

6.3.3 Implementation

As mentioned in Section 6.3.1, all already described fault tolerance mechanisms (except the "Restarting after Node Failures") have to be activated for the "Tolerating Root Failures" mechanism. There are two reasons for it. The first reason is that the guarantees of these mechanisms are required for the working of our root fault tolerance mechanism. The other reason is that the using of many data structures introduced by the already presented mechanisms are indispensable for the "Tolerated Root Failures" mechanism. Therefore, many data structures whose descriptions are located in previous sections and which are established for other purposes occur frequently in this Section.

During the implementation of this mechanism, we took care of the following issues:

- Since the watchdog mechanism cannot make a distinction between a node failure and a connection failure, the situation in which a network is split and the original root and a new elected root may exist at the same time has to be avoided.
- Since Distributed Maple is strongly centralized, the root stores some extra information collected from all other components of a session. This information, which is lost due to the root failure, but which is required for the further execution of the session, has to be recollected efficiently on the elected root.
- The stable storage system has to be independent from the root and the main task of a Distributed Maple program has to be logged in it.

New Data Structures and Messages

- initRootId is a constant and its value is the identifier of the original root in a session. During an execution, the original root is the only one which is connected with a user via a Maple frontend.
- **rootId** is a variable which contains the identifier of the current root node (initially *rootId* is equal to *initRootId*).
- **initNumber** is a constant which contains the number of the non-root nodes after a session initialization.
- numberOfConnectedNodes is a variable and it is located on shadow root nodes. This variable contains the number of those nodes which are reachable to a shadow root node during the root election.
- **shadowRoots** is a list which contains the identifier of the shadow root nodes. The order of elements in this list determines a priority order among the shadow roots, too.
- By a message **shadow**:<**name**, **path**>, a new shadow root node can be defined. The message has two arguments. The first argument *name* is the name (or internet address) of a machine. The second argument *path* is the access path of logging directory on this machine.
- A message **check_root** is sent to all reachable nodes by a shadow node that can contact neither to the current root nor to another shadow node which have more priority.

- A message **root_lost**: < **state** > has an argument *state* which is a boolean value. This message may be sent in two cases:
 - 1. If a non-root node loses the contact with the current root, it sends a root_lost:<true> to the first live shadow root in a list of shadowRoots.
 - 2. If a message check_root arrives from a shadow root k to a non-root node. In this case, if the non-root has already sent a message root_lost:<true> to k, nothing happens. If the non-root node can still interact with the current root or the current root although became unreachable to this node, but it can contact another shadow root with higher priority, then it sends back to shadow root k a message root_lost:<false> (in the implementation of the "Tolerating Root Failures" mechanism, we do not use root_connected: messages as in the description of its algorithm. Instead of it, the message root_lost:<state> is applied with a boolean value "false" as its argument).
- By a message **new_root**, the new root is announced in a session. Any node which receives such a message, accepts the sender of the message as the new root (see in more details below).
- In a message **scheduled_tasks**:<**load**, **t1**, **t2**, ...>, each node sends the identifiers of those tasks to the new root which are scheduled to this node for processing. Furthermore in the first argument *load*, the number of those tasks is sent which are already under processing on the node. This message is used for the initialization of load balancing mechanism (see Section 3.2.4) and a hash table *scheduled_tasks* (see Section 6.1.3) on the new root. The argument's number of this message is varying (depending on the number of scheduled tasks on a node).
- receivedRootLost is a list and it contains the identifiers of those nodes from which a message root_lost:<state> has arrived. A term |receivedRootLost| denotes the number of elements of this list in the description of implementation.
- **trueRootLost** is a list and it contains the identifiers of those nodes from which such a message **root_lost**: <**state**> has arrived whose argument *state* is equal to value "true" A term |trueRootLost| denotes the number of elements of this list in the description of implementation.

- **notReachableNodes** is a list on a shadow root node *i* which contains the identifiers of those non-root nodes which become unreachable to *i* after a root failure is detected, but before a new root is elected.
- **checkroot_sender** is a list which contains the identifier of those shadow root nodes whose sent **check_root** messages have not be answered yet.
- existing_tasks is a list whose elements can be task identifiers. This data structure is needed for rescheduling those tasks which were under processing:
 - either on the previous root before its failure or
 - on some other nodes which fail before the new root is announced and initialized (but the "Tolerating Non-Root Node Failures" mechanism has not be able to reschedule all the affected tasks yet, because of the root failure).
- numberOfMessages is an integer variable. It counts the received scheduled_tasks:<load, t1, t2, ...> messages on the new root.
- shadowMessages is a list which contains all shadow: < name, path > messages issued already in a session. This list is needed for the initialization of restarted nodes.

Activating and Initialization of Tolerating Root Failures

Similarly to other fault tolerant mechanisms in the system, the "Tolerating Root Failures" mechanism can be activated by the call dist[logging](5) after a session initialization. The effect of this command is that the Maple frontend sends a message stable: <5> to the root scheduler which broadcasts this message to all nodes.

The shadow root nodes in a session must be given explicitly one by one by the call dist[shadow] (name, path). name is one of the machine names which were given at the session initialization and path is the access path of the directory logging on the given machine. These given data are sent in a message shadow:<name, path> to the root scheduler which broadcasts this message to all nodes. If such a message arrives to a node, it is inserted to a list shadowMessages on every node. Furthermore, the identifier of the given node is determined and added to another list shadowRoots.

Originally, the execution of a main task of a Distributed Maple program is always attached to the Maple frontend. Therefore, source code of this task is never logged into storage system and it is unaccessible for other nodes, too. To guarantee, that a Distributed Maple program is performed until completion even if the root fails in the middle of execution, other nodes has to be able to re-run the main task. For achieving this, the source code of a main task has to be given as the argument in the call dist[main] (source) (for an example, see Section 7.3). If such a command is issued, the Maple frontend removes the "new line" characters from the argument source and assigns a unique label to it. Then it sends the following messages to the root scheduler:

- 1. By sending a message all:<cat(label, ":=proc() ", source, "end:")>, source is distributed to every node as a predefined 0-ary function (the Maple function "cat" which simply concatenates its parameters is evaluated before the message is sent).
- 2. By sending a message task: <t, label>, the execution of source is triggered (task identifier t is generated and assigned to this task as usual). The root will schedule this task to a node.

A Distributed Maple program may contain more than one dist[main] (sour-ce) commands, since the assigned labels are unique so are the assigned task identifiers.

Root_lost Message Handling

When a node k receives a message root_lost: $\langle state \rangle$ from another node i, k adds i to list receivedRootLost; and if the value of argument state is true, k adds i to list trueRootLost, too.

Check_root Message Handling

When a node i receives a message check_root from node j, node i adds the identifier of j to list $checkroot_sender$.

New Watchdog Modes on Non-Root Nodes

The leader election of our "Tolerating Root Failures" mechanism is implemented in two new operational modes of the watchdog mechanism located on the non-root nodes. These are called *Root_lost Mode* and *Shadow_root Mode*. If a non-root node *i* detects that the root became unreachable to it and reconnection time expires, its watchdog thread changes to the *Root_lost Mode*, which does the followings:

1. First of all, the watchdog thread takes from list *shadowRoots* the identifier of the first shadow root node which is not designated as dead

in hash table crash (see Section 6.1.3) and which can be reached by establishing a peer connection.

Since an immediate response is required for the establishing of a new peer connection (and since the recently failed peer connections are detected and closed by the watchdog mechanism before the root failure is determined), the availability of a node can be determined by checking if there is not an existing peer connection between the node and node i (if such a connection exists but fails in the meantime, node i eventually aborts, see Step 4).

- 2. If such a shadow root node does not exist, *i* aborts. If the selected identifier *k* is equal to *i*, then the watchdog thread on *i* changes to the Shadow_root Mode. Otherwise *i* sends a message root_lost:<true> to *k*.
- 3. It takes one by one the shadow root identifiers which is located in list *checkroot_sender* and sends a message root_lost:<false> to them, except to k.
- 4. Until a message new_root arrives to *i*, *i* periodically checks the connection to the chosen shadow root *k* similarly to the original watchdog algorithm. If *k* becomes unreachable to *i*, *i* aborts. If further check_root messages arrive to *i* in the mean time, they are answered also with messages root_lost:<false>.

In this situation, it does not make sense to check the peer connections of i and apply the "Tolerating Peer Connection Failures" mechanism, because we cannot redirect the lost messages via the root (and neither via the selected shadow root k, since k may not become the new root). The broken peer connection is detected and the lost messages are resent only after the root election (when the watchdog thread returns to its normal operation).

5. If a message new_root arrives to i, its watchdog thread returns to its normal operation.

If the watchdog thread on node k selects from list shadowRoots a shadow root identifier which is equal to k, then it changes to the $Shadow_root\ Mode$. It works as follows:

1. Node k sends a message check_root to each node which is not designated as dead in hash table crash and which has not sent a message root_lost:<true> to k yet. Variable numberOfConnectedNodes is initialized with the number of dead nodes in crash.

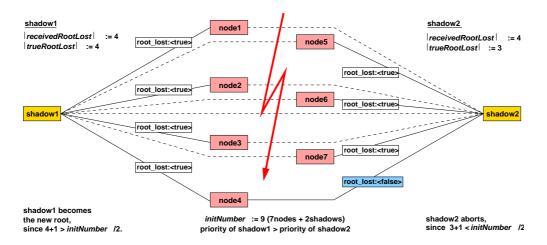


Figure 6.6: Root election with two competitor shadow root nodes.

2. Until the condition

 $numberOfConnectedNodes \leq |receivedRootLost|$

or condition

$$|trueRootLost| + 1 > initNumber/2$$

becomes true, k regularly checks the connection to the reachable nodes similarly to the original watchdog algorithm. If k cannot contact to a node i anymore, k closes the peer connection to i, decrements the variable numberOfConnectedNodes, adds i to list notReachableNodes; and if i occurs in lists receivedRootLost or trueRootLost, then i is removed from these lists.

If the condition

$$numberOfConnectedNodes + 1 < initNumber/2$$

(the sum of the shadow root k and reachable nodes is less or equal than the half of the total number of non-root nodes in a session) becomes true in the mean time, then k aborts.

3. If the condition

$$|trueRootLost| + 1 > initNumber/2$$

(the sum of the shadow root k and the nodes which voted positively is greater than the half of the total number of non-root nodes in a session) is true, then k becomes the new root, see the case of shadow1

on Figure 6.6. In this case, the watchdog thread of k sends a message new_root to the server thread of k and the watchdog thread terminates (because a watchdog thread will be started and initialized for the new root by the server thread of k). Otherwise k aborts, see the case of shadow2 on Figure 6.6.

While the root election is performed by watchdog threads, the server threads of the nodes are not disturbed or interrupted in doing of their normal operation and the processing of already scheduled tasks is continuous on the Maple kernels.

New_root Message Handling

If a message new_root is received by a node k, then its handling depends on the sender of this message. If the sender is the watchdog thread of k, then k has to initialized some additional data structure to become the new root. But all other activities are common (independently such a message arrived from the local watchdog thread or from another node).

Thus, if node k receives a message new_root from its watchdog thread, k handles this message as the new root:

- 1. An empty scheduled_tasks hash table is created.
- 2. The connect thread of k is stopped.
- 3. The system information is loaded from the configuration file *dist.system* (which is located originally on every node).
- 4. A message new_root is broadcast to every reachable node.
- 5. For those node identifiers which are designated as dead in the hash table *crash*, the Insert Operation of "Restarting after Node Failures" mechanism is called (for its description, see Section 6.2.3).
- 6. If the list notReachableNodes is not empty, then the contained node identifiers are taken from notReachableNodes and the "Tolerating Non-Root Node Failures" mechanism is performed on them.
- 7. From the extensions of descr. taskId files located in the directory logging, all logged task identifiers are restored and loaded to a list existing_tasks (see Figure 6.7a).
- 8. A new watchdog thread is started.

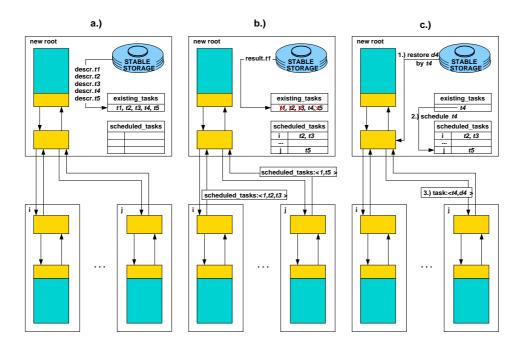


Figure 6.7: Rescheduling after Root Failure: a.) Restoring all task identifiers logged in a session b.) Removing the identifiers of those tasks which are either already computed or still under processing. c.) Reschedule the remainders.

The following steps are performed on both the new root k and all other nodes, if a message new_root arrives:

- 1. The variable rootId is set to k.
- 2. The new root k is designated as dead in hash table crash. Namely, crash refers only to the states of non-root nodes, but k is not available any more as a non-root node. Furthermore, if the new root k fails in a later time and another node becomes the root, then k will be restarted when this next new root receives a message new_root (see above, at Step 5 of "new_root message handling" on the new root).
- 3. The unanswered requests which were forwarded to the failed root are resent to the new root k in the same way as in the "Tolerating Root Failures" mechanism (see Dead Message Handling in Section 6.1.3).
- 4. All other kinds of messages which were sent to the failed root, but which have not been acknowledged yet are resent to the new root k in the same way as in the "Reconnecting" mechanism (see Reconnection Message Handling in Section 5.1.3)

5. By using the contents of list running_tasks and of hash table externUsed, the identifiers of all the tasks are sent in a message scheduled_tasks:<load, t1, t2, ...> to the new root k which are scheduled to the sender node for processing (see Figure 6.7b). The description of both data structures running_tasks and externUsed can be found in Section 4.3.2.

Scheduled_tasks Message Handling

When a message scheduled_tasks:< load, t1, t2, ...> arrives at the root k, the processing of this message is done as follows:

- 1. The variable numberOfMessages is incremented.
- 2. The received task identifier is removed from list *existing_tasks* (see Figure 6.7b).
- 3. The list of received task identifiers is inserted with the identifier of sender node as a key into hash table *scheduled_tasks* (see Figure 6.7b).
- 4. If numberOfMessages is equal to the number of all reachable nodes, then numberOfMessages is set to 0 and the identifier of all already computed tasks is restored from the extensions of result.taskId files (see Figure 6.7c). These restored task identifiers are removed from list existing_tasks. Afterwards, the task descriptions which are referred by the identifiers remained in existing_tasks are restored from the storage system and rescheduled to some nodes.

If no task identifier remains in *existing_tasks* and hash table *scheduled_tasks* is also empty, furthermore there is no scheduled task on the root, then the session terminates.

The reason why the identifiers of computed tasks are not removed from existing_tasks immediately after this data structure has been initialized with the extensions of descr. taskId files (in the processing of new_root message) is the following. There may exist some store:<t, r> messages which are lost due to the root failure. But they are resent and processed (and their held task result are logged) before the scheduled_tasks:<load, t1, t2, ...> messages. Hereby, less tasks are rescheduled redundantly.

Modified Dead Message Handling on the Root

At the end of handling of a message dead:<i>, the root checks whether a message $scheduled_tasks:<load$, t1, t2, ...> has arrived from node i. If it has already arrived, then the variable numberOfMessages is decremented.

Otherwise the root checks whether the number of all reachable nodes became equal to numberOfMessages by the failure of node i. If they are equal, Step 4 of "Scheduled_Tasks Message Handling" is executed.

Modified Store Message Handling

At the end of handling of a message store:< t, r>, the session may terminate, if and only if initRootId is not equal to rootId, $existing_tasks$ and $scheduled_tasks$ are empty, and there is no scheduled task on the root.

In a later session, the system is able to recover the result of the whole computation by the "Logging" mechanism.

Using Together the Tolerating Root Failures and Restarting after Node Failures mechanisms

If these two mechanisms are used together, then the *Insert Operation* of the "Restarting after Node Failures" mechanism is not called immediately after a node i is designated as dead. But it is called if and only if the broadcast message $\mathtt{dead}: < i>$ is acknowledged (see Section 5.1) by at least the half of the total number of non-root nodes.

If a node is restarted, every message shadow:<name, path> which is stored in the list shadowMessages is sent in order to the restarted node.

Chapter 7

Examples and Test Experience

In the previous chapters, we described the theoretical background and functionality of the fault tolerance mechanisms in Distributed Maple. Now, we present how they can be used.

First, we give a short overview about new commands, which are needed for using the new features. Then, we present by examples the usage of them. At the end of the chapter, we summarize our test experience related to fault tolerance in Distributed Maple.

7.1 New Commands

Since the new fault tolerance features of Distributed Maple are transparent to Maple programs (the programs need not be changed for using them). The only exception is the "Tolerating Root Failures" mechanism (see below).

All fault tolerant mechanisms integrated in Distributed Maple can be switched on and off by the command

$${\tt dist[logging]}(\mathit{level});$$

where the parameter *level* sets the fault tolerant level of the system. Its value can be 0, 1, 2, 3, 4 or 5 where 0 switches off all fault tolerant mechanisms; the values from 1 to 5 activate more and more fault tolerant mechanisms. Namely, if a higher fault tolerant level is chosen, then all fault tolerant mechanisms on the lower levels are automatically switched on, too (because the mechanisms on the higher levels use the features of the mechanisms on the lower levels):

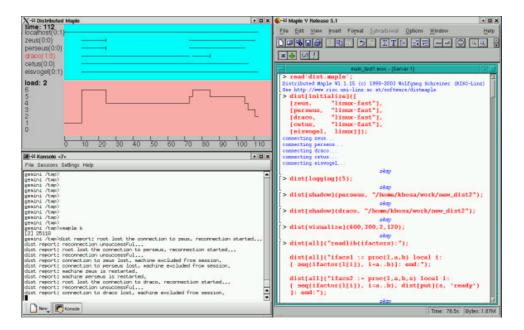


Figure 7.1: The user is informed about fault tolerance activities

- 1 ... switches on the "Fast Mode" of the "Logging" mechanism,
- 2 ... switches on the "Safe Mode" of the "Logging" mechanism,
- 3 ... switches on the "Tolerating Non-Root Node Failures" and "Tolerating Peer Connection Failures" mechanisms,
- 4 ... switches on the "Reconnecting" and "Restarting after Node Failures" mechanisms,
- 5 ... switches on the "Tolerating Root Failures" mechanisms.

This command may be issued only after the *dist.maple* interface to the distributed backend is loaded from the file dist.maple and the distributed session is established by the command dist[initialize].

Usage of "Logging" When the user activates one of logging modes, the system starts to save the results of concurrent tasks to a directory logging. If the system fails, the user has to restart it. A second (or a later) execution restores the already computed and logged task result. When the computation finishes and dist[terminate] command is executed, the directory logging is removed.

The logging and recovery mechanism is completely transparent to Distributed Maple sources. If a task is given (a) new identifier(s) in a second,

third or later execution, the task can be referred by each of them (see Section 7.2).

We suggest to use always the Safe Mode which supports higher-order tasks and whose extra overhead compared with the Fast Mode is negligible.

Usage of "Tolerating Non-Root Node Failures" and "Tolerating Peer Connection Failures" These mechanisms monitor the connections between the nodes in the background and reschedule the corresponding tasks or resend the corresponding messages if necessary. The user is informed about their activities by messages. In that case, if on-line visualization is switched on and a machine becomes unreachable, its name turns red in the visualization window (see Figure 7.1).

The "Tolerating Non-Root Node Failures" mechanism cannot make a distinction between connection failure and node failure. If a connection fails between the root and a node, the corresponding tasks will be redirected and the node will be lost to the computational session as in the case of node failures. It may also happen, that a non-root node detects earlier than the root the failure of another node and the message "lost peer connection" is displayed before the user is informed about the node failure.

If we assume that only Stop failures may occur, the system is able to run on this fault tolerance level till the root node crashes or the session is terminated by the user. However, if too many nodes become unreachable to the root, it does not make sense to let the session run further. In such a situation, the user should kill the processes of the root (if the root is unreachable, the remaining nodes shut themselves down) and restart the session (from a saved state).

Usage of "Reconnecting" and "Restarting after Node Failure" As we have mentioned earlier, the main purpose of these mechanisms are reducing the loss of resources after failures. By using the "Reconnecting" mechanism, the execution time of the computation may be reduced. Namely, the tasks which are already under processing (or perhaps finished) on a disconnected node do not need to be rescheduled and computed afresh.

If the reconnection is unsuccessful and the unreachable node is excluded from the session, the root attempts to restart it after some time. If it does not succeed, it waits some time and tries again, and so on. If the reconnection or the restarting of a node is successful, the user is informed about it by messages and name of the machine turns back to black in the visualization window (see Figure 7.1).

Usage of "Tolerating Root Failures" Usage of this mechanism is a bit more complicated than the others mentioned above i.e. it is not enough to switch it on. On the one hand, the user should give the name of those machines (called shadow roots) that may be able to substitute for the original root in case of need. These machines have to be able to access to the directory logging. A machine can be declared as a shadow root with the command

where *machineName* is the name of the machine which is the same as was given to the command dist[initialize]; and *pathOfLogDir* is the access path of the directory logging on the machine. This command can be issued either before or after command dist[logging], too (but only after the command dist[initialize]).

On the other hand, if the user wants to be sure that her or his Distributed Maple program will be performed until completion (even if, the root fails in the middle of execution), all of the non-root nodes have to be able to re-run the source code of main task. By the command

the Maple commands denoted by the parameter *source* is propagated to all nodes; the execution of these commands is started immediately on one of them

So, if the original root becomes unreachable to a distributed session, the remaining nodes are able to undertake its role. Within a session, the root node may change more than once. Since the usage of this mechanism assumes the working of all other fault tolerance mechanisms mentioned previously, all different kinds of stop failures are also handled on this fault tolerance level of the system. However, it still can occur that the system fails, if too many node fails at the same time. In this case, the user must restart the session and continue the computation from a saved state restored by "Logging" mechanism.

7.2 A Simple Example for Logging

In this very simple example, we present the working of the logging mechanism. As usual, we load the file dist.maple and initialize the distributed session first. Our current session consists of the local host and the machine zeus. Then we switch on the Safe Mode of "Logging" and start to execute a task (Maple returns immediately an assigned identifier for the started task).

But before we would query the result of the task, we trigger a session failure off.

```
gemini!5>maple
   1\^/1
            Maple V Release 5.1 (Universitaet Linz)
._|\| |/|_. Copyright (c) 1981-1998 by Waterloo Maple Inc. All rights
\ MAPLE / reserved. Maple and Maple V are registered trademarks of
<____> Waterloo Maple Inc.
             Type ? for help.
> read'dist.maple';
Distributed Maple V1.1.15 (c) 1998-2001 Wolfgang Schreiner (RISC-Linz)
See http://www.risc.uni-linz.ac.at/software/distmaple
> dist[initialize]([[zeus,linux]]);
connecting condor...
                                  okay
> dist[logging](2);
                                  okay
> t1 := dist[start](int, x^n, x);
                                  t1 := 0
> # ----- SESSION FAILURE -----
```

If we assume that the computation of the task was finished before the session failure, the content of directory logging may consist of the following files: descr.0, result.0, sessionid and taskid.1332700025. The file descr.0 and file result.0 contains the description and the computed result of the task (as we can see the extension of both files is the task identifier). For the roles of files sessionid and file taskid.1332700025, see Section 4.2.2 and Section 4.3.2. For accessing the result of the task, we have to restart the system.

In case of restarting, we issue all the commands from loading dist.maple to starting the task. The system assigns a new identifier for the task, but it does not compute it again. If we check again the content of directory logging, we find an additional file there, called link.134217728. The content of this file is the original task identifier and its extension is the new task identifier. By using this file, the task result computed in a previous session can be restored by the new identifier, too. This feature may become crucial, if a higher-order task (see Section 4.3) refers an already computed task after the session has been restarted at least once.

So if we want to display the result of the task, we must issue a command dist[wait] with one of the task identifiers as a parameter. The system checks whether a result file or a link file with the given identifier as an extension exists in the directory logging and recovers the result from them.

At the end, by issuing command dist[terminate], the session is closed and the directory logging is deleted.

7.3 Usage of Tolerating Root Failures

Our next example is a little bit more complicated. We generate 100 of numbers whose order of magnitude are around 10^{32} and at the end this program returns the complete integer factorization of them. Such a computation without failures usually takes approximately one and half minutes on a distributed session that consists of 5 machines (local host + 4 remote nodes) where the machines are Intel Celeron 733 Mhz with 256 MB RAM.

```
gemini!5>maple
             Maple V Release 5.1 (Universitaet Linz)
    |\^/|
._|\| |/|_. Copyright (c) 1981-1998 by Waterloo Maple Inc. All rights
 \ MAPLE / reserved. Maple and Maple V are registered trademarks of
 <____> Waterloo Maple Inc.
             Type ? for help.
> read'dist.maple';
Distributed Maple V1.1.15 (c) 1998-2001 Wolfgang Schreiner (RISC-Linz)
See http://www.risc.uni-linz.ac.at/software/distmaple
> dist[initialize]([
> [perseus, linux],
> [aquila, linux],
> [draco , linux],
> [cetus , linux]
> ]);
connecting perseus...
connecting zeus...
connecting draco...
connecting cetus...
                                     okay
> dist[logging](5);
                                     okay
> dist[shadow](perseus, "/home/kbosa/work/new_distmaple");
> dist[shadow](draco, "/home/kbosa/work/new_distmaple");
                                     okay
> dist[all]("readlib(ifactors):");
                                     okay
> dist[all]("ifacs := proc(l,a,b) local i; [ seq(ifactor(l[i]), i=a..b) ]: end:");
> t:=dist[main]("local random, 1, t1, t2, t3, t4, r1, r2, r3, r4;
> readlib(randomize); randomize(4711);
> random := rand(10<sup>32</sup>);
> 1 := [ seq(random(), i=1..100) ];
> t1 := dist[start](ifacs, 1, 1, 25);
> t2 := dist[start](ifacs, 1, 26, 50);
> t3 := dist[start](ifacs, 1, 51, 75);
> t4 := dist[start](ifacs, 1, 76,100);
> r1 := dist[wait](t1);
> r2 := dist[wait](t2);
```

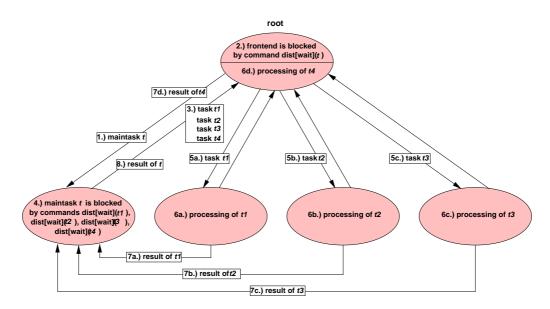


Figure 7.2: Execution Model for the Example in Section 7.3

First of all, we establish the session with 5 nodes, then we activate all the fault tolerance mechanisms in Distributed Maple (fault tolerance level 5). Afterwards, we enumerate the shadow root nodes and we give the local access path of directory logging on each such nodes.

With the command dist[all], we load the library *ifactors* of Maple to each node and by using also this command we define a new function, called *ifacs* on every node which simple calls the Maple function *ifactor* for some elements of a list one by one.

The main function is defined as the parameter of command dist[main]. Its structure is like an ordinary function in Maple (e.g.: it may contain local variables), except on thing: it cannot be finish with a command "end;" (since it is given between brackets), but it must return a value. Our current main

function generates the 100 numbers first and then distributes them among 4 concurrent tasks equally. Each task is scheduled to some node where it runs the function ifacs to compute the factorization of the given numbers. The execution model of this program (without any failure) is depicted in Figure 7.2; this model assumes that the default configuration of Distributed Maple is used: maxload = 0 and minload = 0 (see Section 3.2.4).

In case of root failure, one of the shadow root becomes the new root and the session finishes the whole computation. In such a situation, we can display the result if we restart the session and issue the request dist[wait] which refers to the main task.

7.4 Test Experience

The effect of fault tolerance mechanisms on the performance of Distributed Maple has not been measured yet, but we do not expect it to be significant. For instance in the case of the "Logging" mechanism, task descriptions and task results are saved by separate threads and thus do not hamper the normal flow of operation. These descriptions and results are also communicated in the basic operation model; their size is therefore bound by the performance of the communication system rather than by the extra overhead of the saving mechanism. Additionally, the "Logging" mechanism introduces only one extra message type, the store: < t, r > message, for saving of the task results to the storage system (task descriptions are saved when tasks are scheduled).

The overhead in case of the other mechanisms is also not significant, because these mechanisms maintain only some small extra data structures both on root node and on each non-root node. They do not use additional messages during the normal operation.

In the testing phase, we executed some long-running computations, whose solutions are required approximately 3 or 4 days. During these executions, we triggered several *Stop* failure situations (both root and non-root failures) and the system was able to tolerate these kinds of failures and finish the computations.

On the average only one long-running test from every 10 failed with corrupted message (message failure). But in such cases, the computations could always be continued from a saved state of the session.

Chapter 8

Conclusions

We have implemented in Distributed Maple some fault tolerance mechanisms such that we can guarantee the following: the system does not deadlock and continues normal operation, if any node crashes or some connection between any two nodes breaks; if the system fails after all, we can restart it and continue the computation from a saved state. With these developments, Distributed Maple is by far the most advanced system for computer algebra concerning reliability in distributed environments. The improvement of the system is demonstrated by Figure 8.1.

The system can still fail if more than n/2 non-root nodes fail, or if the root and all shadow nodes fail within a certain time bound (i.e., if there is not enough time for reconnection).

The system can also fail if neither the root nor one of the shadow nodes has connected at least n/2 non-root nodes (this may happen if the network is split to more than two almost equal parts).

There remains only one kind of *Stop* failure situations which may let the system deadlock: if a kernel process fails. To solve this problem, we plan to introduce a new watching mechanism which scans the kernels and restarts them if necessary.

Our work shows how distributed computations that operate with an essentially functional parallel programming model can tolerate faults with relatively simple mechanisms, i.e. without global snapshots as required in message passing programs. The runtime overhead imposed by the "Logging mechanism" is very moderate; adding tolerance of node failures (in case of both root node and non-root node) on top does then not require much extra overhead.

One reason for this simplicity is the delegation of all logging activities to a single root node that also performs the task scheduling decisions; the model is therefore not scalable beyond a certain number of nodes. However, 96 CONCLUSIONS

Stop failures		without fault tolerance	using fault tolerance
the root node crashes		system aborts	system continues the normal operation
a non-root node crashes	less than half or half of non-root nodes crash within a certain time bound	deadlock	system continues the normal operation
	more than half of non-root nodes crash within a certain time bound		system aborts
	the root and all shadow root nodes crash within a certain time bound		system aborts
one or more connections between the root and non-root nodes break		deadlock	system continues the normal operation
one or more connections between non-root nodes break		deadlock	system continues the normal operation
one or more Maple processes fail		deadlock	deadlock

Figure 8.1: Assessment of Distributed Maple Fault Tolerance

it is suitable for the system environments that we have used up to now (≤ 30 nodes); many parallel computer algebra applications do not scale well enough to profit from considerably more nodes.

8.1 Comparison with Checkpointing

In order to put our work in context, we are now going to compare the fault tolerance features of Distributed Maple with those of systems based on *check-pointing* mechanisms. As a concrete example, we take the *P-GRADE* environment into which such a mechanism has been recently integrated [37] (see Figure 8.2). P-GRADE is a parallel programming environment which supports the whole life-cycle of parallel program development [51]. A P-GRADE application is always centralized, where a server coordinates the start-up phase and the execution. The primary goal of the P-GRADE checkpointing mechanism was to make P-GRADE generated applications able to migrate among nodes within a cluster. Its secondary goal was to make periodic checkpoint for supporting fault tolerance.

In the case of the P-GRADE checkpointing, the main idea was to save the states of the processes by making regularly snapshots of them. Thus during the execution a computing phase periodically alternates with a checkpointing phase. As mentioned in Section 2.2.2, such an approach is relatively complex

	P-GRADE checkpointing	fault tolerance in Distributed Maple
architecture	centralized	centralized
applicability	it is targeted to general parallel applications	it is restricted to parallel programming models based on functional tasks
transparency	transparent	transparent
the saving method	a computing phase is periodically interrupted by a checkpointing phase	continuous
if the system fails during the computing phase	it can be restarted from the last checkpoint	it is able to recognize the corruption of a file; thus it may reuse each
if the system fails during the check- pointing phase	it can be restarted only from the previous checkpoint	properly stored datum in a later session
in case of node failure	it is able to continue execution from the last checkpoint (except if the server fails)	it is able to continue execution by the migration of the tasks (also if the root fails)

Figure 8.2: Comparison of Fault Tolerance in Distributed Maple and P-GRADE Checkpointing

because it is targeted to general parallel applications. In the case of our "Logging" mechanism, the system saves the computed task results instead of the states of the processes and this saving operation is continuous. This solution is simpler, but it is restricted to parallel programming models based on functional tasks, i.e., tasks that return results without causing any side-effects. Both mechanisms are centralized and transparent to the applications.

P-GRADE makes a checkpoint if and only if an external tool asks the server for the saving of a checkpoint. If the system fails during the computing phase, it can be restarted from the last checkpoint. If the system fails during the checkpointing phase, it cannot use any already saved information of this checkpoint and it can be restarted only from a previous checkpoint. The "Logging" mechanism saves every task descriptor and task result into separate files and it is able to recognize the corruption of a file; thus it may reuse each properly stored datum in a later session.

If a node fails (except for the server), the P-GRADE is able to recognize this and to continue execution automatically from the last checkpoint. In such a case, Distributed Maple is simply able to continue execution by the migration of the corresponding tasks (also if the root node fails). Distributed Maple regularly checks whether a failed node has rebooted again and in this case restarts the corresponding node process.

Summarizing, the most important advantage of the P-GRADE check-pointing mechanism is that it is made for general parallel applications. But its fault tolerance features are limited in that the main purpose was the dynamic migration of the processes among the node. The main disadvantage of the fault tolerant mechanisms in Distributed Maple that they are special mechanisms and they cannot be used for any parallel computing model. The advantages of our mechanisms are the following: the saving method is continuous; if the system fails in any time, the next session is able to use all properly saved intermediate task results; if any node or connection fails during the execution, the system is able to tolerate it and continue normal operation without human intervention.

Furthermore, an additional advantages of applying of functional task model is that the normal operation on faultless nodes is always continuous, because it does not have to be interrupted or suspended due to handling and tolerating of any failure situations detected in a session. Both systems are centralized, therefore the scalability of these systems is an open question.

8.2 Plans for Future Developments

Distributed Maple shows that the application of cluster computing to computer algebra is able to extend the range of solvable problems. However, its centralized architecture is not scalable beyond a certain number of nodes. This fact is the next difficulty to overcome before we can enlarge further the range of those problems to which the parallel computer algebra algorithms implemented in this system are applicable.

To achieve more scalability, it would be a good idea to make the system use an underlying grid infrastructure [23], e.g. the Globus [24] middleware (similarly to the case of PVMaple [49, 50]). By using grid services, numerous computers may become available for Distributed Maple sessions.

Of course the chance to access a large number of resources by invoking grid services is not enough in itself to that the system can become (largely) scalable. The architecture and the communication protocol of Distributed Maple also have to be modified and rearrange for handling such a large number of resources. Furthermore, it is very important to keep and adopt our fault tolerant achievements to such a proposed scalable architecture.

A possible answer can be the applying of a hierarchical programming model by which the original execution model of Distributed Maple can be extended to a tree of computational sessions and subsessions. The core idea is that when a frontend executes a Distributed Maple algorithm, it requests from some kind of grid middleware a set of resources which subsequently

form the corresponding computational session. If in the course of the algorithm a parallel subalgorithm is invoked on any computational node of this session, this node may allocate new resources from the grid middleware and build a subsession for the execution of the subalgorithm. In this hierarchical programming model, a tree of sessions can be dynamically constructed whose resources are collected from all over the Internet.

Since the structures of such a computational session and its subsessions separately are very similar to the original architecture of the Distributed Maple, our fault tolerance mechanisms presented in the previous chapters can be extended to such a proposed environment by minor modification; this could demonstrate how a distributed system based on functional tasks simplifies some problems in grid computing.

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Education

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Research topic: Parallel Computing and Fault Tolerance

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1994 – 1999: M.Sc. in Computer Science.

University of Arts and Sciences "Kossuth Lajos" (KLTE),

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1990 – 1994: High School "Földes Ferenc", Miskolc, Hungary

I passed the final exam with excellent marks.

Research Interests

- Parallel and distributed computing
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- Fault Tolerance
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Journal Publication

Károly Bósa, Wolfgang Schreiner.

Tolerating Stop Failures in Distributed Maple.

Parallel and Distributed Computing Practices, special issue on DAP-SYS 2002, 15 pages, NovaPublishers, 2003 (to appear).

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Refereed Publications

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Fault Tolerance for Cluster Computing Based on Functional Tasks.

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Task Logging, Rescheduling, and Peer Checking in Distributed Maple.

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Wolfgang Schreiner, Károly Bósa, Gábor Kusper.

Introducing Fault Tolerance to Distributed Maple.

Technical Report 01-03, RISC-Linz, Johannes Kepler University, Linz, Austria, January 2001.

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Professional Specifications

• I have 6 years experience in Object Oriented Technology and Java programming.

- For my Ph.D. thesis, I developed Java software. (Fault Tolerance for Distributed Maple).
- For seven months, I have participated in the development of the Panasonic mobile phone X60 at the COMNEON GmbH. In this project, I worked with C++.
- For my diploma work, I also developed Java software. (The MNEWS Information System).

More:

Operating systems: DOS, Windows (98/NT/2000), UNIX(Linux)

Programming languages: Pascal, C/C++, Java, and Assembler

Database handlers: Oracle(SQL), MS Access
Others: HTML, XML, TEX, and Perl

Other Professional Experience

September 2003 - March 2004: Working at COMNEON GmbH. and participating in the development of Panasonic mobile phone X60. *Topic*: Member of a group whose task was the integration of Teleca's WAP/MMS application into the Cell Phone Operating System APOXI.

November 2001 - May 2002: Member of the System Administration Group of RISC-Linz.

Topic: Installation and maintains of Windows and Linux systems. Configuration and testing new softwares (VMware, Xfree86-4, port scanners, etc.).

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Since October 1999, I am a Ph.D. student at RISC-Linz in Austria.

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Topic: Network organization, network maintenance, network administration: Windows NT, ORACLE.

October 1997-February 1998: University-GH Paderborn with Tempus scholarship (Germany).

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1996-1999: Teaching at the Institute of Mathematics and Informatics, KLTE (University of Arts and Sciences "Kossuth Lajos").

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