LOAD-BALANCING METRIC FOR SERVICE DEPENDABILITY IN LARGE SCALE DISTRIBUTED ENVIRONMENTS

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Abstract. Today we live in a World-as-a-Service society, where electronic services are used everywhere, to support from large collaborations to ever more scalable business applications. In this era, specific service capabilities such as dependability and availability are more than ever needed to sustain ever more critical business- and service-oriented quality metrics. For example, today businesses need to know they can rely on a banking service called from used inside a complex client-oriented application. Service composition could not work unless services can reliably expect results from one another. In this context, we present a load-balancing metric designed to provide increased levels of availability for a wide-range of services running inside globally-scale distributed environments. We propose the use of “service containers”, special mechanisms designed to encapsulate sets of replicated and distributed services. These mechanisms make faults transparent for the end-user based on smart decisions based on monitored information and specific metrics. We propose a set of service-oriented metrics designed to increase the use of resources in such a distributed approach. The proposed container-based approach is part of an architecture designed to increase dependability (resilience, fault tolerance, security) of a wide-range of distributed systems. We present evaluation experiments over real-world scenarios. We show how the proposed container-based mechanism can not only deliver increased tolerance to failures, but also it leads to improvements in the time-of-response, scalability or load-balancing. The solution is able to cope with various scenarios involving different failure-injection patterns in the system. The novelty of proposed solution is represented by the new metric for multi-criteria load-balancing within a fault tolerant distributed environment based on replication.

Key words: Web Services, Dependability, Load-Balancing, Service Replication, Distributed Systems.

AMS subject classifications. 68M14, 68M15, 68Q10

1. Introduction. Distributed systems play an important role as a background support in many areas such as trade, communication, science, government and even entertainment. The Web service architecture for large distributed environments is preferred today by businesses to support the interaction with users, because of advantages such as ergonomic behavior, portability, availability and transparent access from different platforms. All Web Service elements and corresponding designs are ever more important for current distributed systems [6]: standard structure of messages sent between clients and services, description method, discovery method, invocation method and development.

With the increasing interest for distributed systems, also customers’ requirements become complex and are today addressed by specific SLAs (Service Level Agreements). For example, users can be interested in invoking a specific service which answers correctly at their requests in a reasonable time with a specific degree of accuracy. Also, time availability of service is very important: as the service is available to customers over time, the service will be more used. Services that fill these requirements are part of the dependable services category [13].

The concept of dependability [1] for large scale distributed systems (LSDS) is very complex and has been refined over many years of research. Dependability addresses concepts such as availability, reliability, safety, confidentiality, integrity and maintainability. Availability is the property of a system to offer correct service on demand. Reliability is the property of a system to offer correct service continuously. Safety is the absence of catastrophic effects on the environment, even in case of incorrect service. Confidentiality is the absence of unauthorized disclosure of information. Integrity is the absence of improper system state alteration. Maintainability is the property of a system to be easily repaired and modified. Security is the concurrent existence of availability to authorized users only, confidentiality, and integrity. Availability and reliability are essential in distributed systems, especially systems considered at large scale because customers expect system be operational despite technical problems and work as its specification even though some components were damaged.
In this context, the QoS could be considered as a quantitative measure of service dependability. There are many ways to increase the QoS [13], such as: bug fixing before deployment, mechanisms for fault tolerance, mechanisms for recovering from error, etc. In the development process, most developers choose the solution less expensive and faster in detriment of quality for service device. By contrast, service providers want to offer reliable services to customers, to ensure a certain level of QoS.

In this paper we present a solution to satisfy the service dependability in LSDS. We propose a balancing metric to increase availability and a reputation model designed to satisfy QoS requirements. The proposed solution is part of an architecture designed to optimize the access to services with respect to availability and scalability. The solution stands out by the support given to services providers, by implementing a system as a service container.

The paper is structured as follows. Related works are described in Section 2. Section 3 considers the service based architecture and highlights the technology solution chosen in order to implement the proposed architecture. Implementation details are explained in Section 4. We present in Section 5 the load-balancing metric used for replicated services. In Section 6 are presented the performance tests, scenarios used and performance results. The paper ends with conclusions and some possible future works.

2. Related Work. The research topics in distributed systems address the problem of building a reliable and highly-available distributed service by replicating the service on two or more hosts using the primary-backup approach. Three implementations are possible: one that makes heavy use of the notification interface defined in OGSI, one that uses standard grid service requests instead of notification, and one that uses low-level socket primitives [17]. The solution presented in [18] consider the problem of supporting fault tolerance for adaptive and time-critical applications in heterogeneous and unreliable grid computing environments. This is supported by techniques for implementing k-resilient objects, distributed objects that remain available, and whose operations are guaranteed to progress to completion, despite up to k site failures [3]. There is a commercial solution for enterprise-grade system that provide fault-tolerant virtual machines, based on the approach of replicating the execution of a primary virtual machine (VM) via a backup virtual machine on another server [12, 16].

There are some approaches to fault tolerance assuring at TCP level [10] considering a splicing mechanism. There are three enhancements to the TCP splicing mechanism: (1) Enable a TCP connection to be simultaneously spliced through multiple machines for higher scalability; (2) Make a spliced connection fault-tolerant to proxy failures; and (3) Provide flexibility of splitting a TCP splice between a proxy and a back-end server for further increasing the scalability of a web server system.

In [11] the authors present a system that ensure services dependability oriented on highly available and scalable Grid services. The services are classified in three separate categories: (i) services to store/query structured data in a scalable fashion; (ii) services to communicate in a scalable fashion; (iii) services to (partially) hide the effects of scale. The solution for availability ensuring for Grid Services is used in XtreemOS project.

Accurate failure prediction in Grids is critical for reasoning about QoS guarantees such as job completion time and availability. Statistical methods can be used but they suffer from the fact that they are based on assumptions, such as time-homogeneity, that are often not true. In particular, periodic failures are not modeled well by statistical methods. In [7] is presented an alternative mechanism for failure prediction in which periodic failures are first determined and then filtered from the failure list. The remaining failures are then used in a traditional statistical method.

Another project that consider load-balancing and fault tolerance is presented in [2]. It is based on comparison between Checkpoint-recovery and balancing using Intra-cluster load-balancing, Intra-grid load-balancing solutions. The project propose a fault detector that detects the occurrence of resource failures and a fault manager that guarantees that the tasks submitted are completely executed using the available resources. Model used in implementation of this fault tolerance technique is existing Intra-cluster and Intra-grid load-balancing model [15].

A project that aims to define and to implement a framework at the application level for development of grid dependable services is DlGS [4, 5]. In this project is described the structure of a Proxy that must combining several identical services from functionality view in another “better” service. A better service means a service with a higher level of dependability. The starting point objective was to design a mechanism to intercept transparent SOAP messages exchanged between client and server. A client sends messages to proxy like this would be a real service. Proxy intercepts the message and processes it based on a fault tolerance model and it then sends to a real service. Messages from the server to the client are transmitted also via proxy, which can
process the response, if any, depending on the fault tolerance implemented model.

3. System Architecture. The main improvement of our solution is a new metric for load-balancing and fault tolerance. The proposed load-balancing metric considers a wide range of monitored parameters to compute the state of the services container. The proposed system architecture is presented in Figure 3.1. For example, the MONITOR SERVICE will respond with a “better” replica because will be capable to take real-time decisions based on specific information from each container of a replica.

![System Architecture Diagram](https://example.com/system-architecture.png)

Fig. 3.1: System Architecture

The proposed architecture implements the ProxyPattern design pattern [8]. The main objective of this pattern is to define a proxy object, what is positioned between the client and the real service for controlling the access at the real service and for realizing certain processing each time a service is accessed. The service container functions similarly to a proxy for replicated services. All messages delivered to the real services are intercepted by the container (with the help of a SOAP listener) and are forwarded to one of the replicas service via the PROXY SERVICE. All actions performed by the container are transparent to clients and services. Each client will consider during communication that it is connected to the real service, although in fact replicas are the one responding at requests like they came from the client-side, not from another service side.

The SOAP LISTENER is a system component responsible with monitoring all SOAP messages received by the services container. This component monitors SOAP messages and verifies if these messages are to be redirected to another proxy service or to the real invoked service. Specific situations when a message is transmitted to the real invoked service are:

- Messages that have been forwarded by proxy to a replica of the invoked service implemented in the same container with Proxy, must not be sent to the proxy anymore, to exclude an infinite loop. These
messages are marked by Proxy with a specific attribute in the SOAP message header.

- SOAP Messages that have as target some specific special services like Admin Service (because this service is used local by providers for services deployment and monitoring) and Load-Balancing Service.

The Monitoring and Load-Balancing Service centralizes all information about replica services and chooses the best replica of a service to be invoking by Proxy Service. The best replica for a specific service is chosen according to the rules described in Section 4, in order to realize a better Load-Balancing for replicas. The proposed solution is based on monitoring information from each services container. The monitoring information is collected from container and sent to a Proxy Monitor. The Proxy Monitor will further calculate a balancing metric which is then used to choose the best replica to which to route the message.

When the Proxy Service receives the response submitted to a replica, it invokes a method from the monitoring service for new information about this replica. The monitoring service has information about the total number of requests received from the clients for a specified service, the total number of processing errors transmitted to clients, as well as the total number of denied requests because of the replicas load. Concurrent access of each function to monitoring information is synchronized, to ensure exclusive access.

The Proxy Service receives SOAP messages from Listener and invokes replicas of the service for sending a response to client and hiding eventually errors. When receiving a SOAP message from Listener, the Proxy Service makes a request to the Monitoring and Load-Balancing Service to find the best replica of the service for which is intended the message and to signal the receiving of a new request from the client side. The received replica from this request is used for redirecting of SOAP message. If the selected replica generates an exception, then the monitoring service is again interrogated to find another replica, which can be used for the actual request. This algorithm is repeated a number equal of steps, if all requests generate an exception or it stops then when a request return an invalid answer. According to the final response of the request (valid response or exception), Proxy Service invokes the monitoring service to update local information and to send the final result to the client.

4. Load-Balancing Metric. To achieve the goal proposed in this paper, making services more reliable, we implemented in each container a method to calculate a metric which helps to assure load-balancing and fault tolerance. The load-balancing functionality of replicas optimizes resources utilization and minimizes the response time of a request.

4.1. Balancing Metric. Each replica of a service has a balancing level calculated according to the information gathered by monitoring tool. The balancing metric is a value between 0 and 100. The balancing metric is calculated using the following formula:

$$BalancingMetric = \sum_{i=1}^{6} P_i \times B_i$$

In this formula we consider some criteria for load-balancing, each criterion having a weight in the BalancingMetric formula.

$B_1$ represents the measure of system usage. It considers the number of threads in the system. Live threads represents the number of threads which are alive (it runs on the processor or follows to be scheduled by the operating system waiting at a blocking condition); the term where this parameter is located is calculated versus the total threads supported by that container (default in Apache Tomcat total threads is equal with 200). The $B_1$ term is:

$$B_1 = 1 - \frac{\text{LiveThreads}}{\text{TotalThreads}}$$

$B_2$ represents a measure of system quality. Number of errors represents total number of errors reported by services container. It grows when a request for a replica in that container is finished with error; the term where this parameter is located is calculated versus the total number of requests. Number of requests represents total number of requests and help to calculate the second term. We increment this number when receive a new request. The $B_2$ term is:
Load-Balancing Metric for Service Dependability in LSDS

\[ B_2 = 1 - \frac{\text{ErrorsNo} + 1}{\text{RequestsNo} + 1} \]

\( B_3 \) shows the processors usage in the system, considering the Java Virtual Machine. *Number of processors* represents total number of processors exited in system that has the services container; the term that contained this parameter is calculated dividing this number at maximum number of processors, that is a generic number, it represents the maximum number of processors that a system can have (if we chose this number 8, so a system can be maxim an opteron system); this parameter tells us how much we can parallel services from container a better throughput. *JVM CPU Usage* represents as percent how much JVM usage occupies from all processors. Maximum value for this parameter is ProcsNo*100%; when this sixth term tends to 1 means that all processors are almost in sleep mode, so JVM has no process in running mode and when tends to 0.5 means that from all processors, only one is “half” free, mean that OS can schedule and other processes and the throughput has still an acceptable value. The \( B_3 \) term is:

\[ B_3 = 1 - \frac{1}{\text{ProcsNo}} \times \frac{\text{JVM CPU Usage(\%)} \times 100}{100} \]

\( B_4 \) represents a way to measure how total free space we have from total memory. When this report will tend to 0, Garbage Collector (GC) will try to delete all unreferenced objects or memory scheduler will try to allocate extra memory for total memory or max memory. Both operations have a high overhead. *Free memory* represents total number of mega bytes free from JVM. *Total Memory* represents total number of mega bytes allocated from Max Memory. Operating system allocates a total number of bytes from JVM. This memory is named Committed JVM Memory, is a fix number throughout runtime. From this Committed JVM Memory, the memory scheduler from java allocates a fix percent for Max memory. Usual, this percent is 60% 70%. All resources are allocated at runtime in total memory, which at first tends to zero and then go to max memory value. When max memory value is equal with total memory value, GC will “clean” the system, removing all allocated resources which are unreferenced. If GC will remove anything, memory scheduler will allocate extra memory for Max memory and this parameter will increase (see Figure 4.1). We have the following:

**Fig. 4.1: JVM Memory**

1. Usage memory value from total memory = Usage percent * Max memory
2. Total memory usage percent * Max memory = Free memory
3. Total memory Usage memory value from total memory = Free memory

So, the \( B_4 \) term is:

\[ B_4 = \frac{\text{FreeMemory}}{\text{TotalMemory}} \]
B_5 represents the proportion of CPU utilization. The B_5 term is:

$$B_5 = \frac{\text{ProcsNo}}{\text{MaxProcsNo}}$$

B_6 represents the measure of overhead introduced by swap memory. Free Swap represents total number of free mega bytes located on the swap partition. Important to consider and this parameter because swap-in and swap-out operations have a high overhead also. The B_6 term is:

$$B_6 = \frac{\text{FreeSwap}(\%)}{100}$$

The values for weights were considered as follows:

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In the BalancingMetric formula the importance of weights decrease from P_1 to P_6. P_1, P_2 and P_3 are the most important weights because found the formula for balancing metric wanted to represent and a trust level (P_1 and P_2), but also because operations of GC and memory scheduler have not a very height overhead in a services container context. The greater is number of requests and the smaller is number of errors, the second term of the sum will approach to P_2 value and will keep this value a period of time as long as possible. This value will decrease very low, because in the worst case at a request that finished unsuccessfully increases both the number of requests and number of errors. P_3 is also a very important weight because even if we have very few requests is enough to have just one request which lead our processors on maxim load and already the system will have a higher response time. P_4 has a smaller weight because operation of allocation memory has not a very high overhead and also P_5 and P_6 have smaller weights because term of P5 is always a constant in that container and at swap-in and swap-out operations system rarely reach.

4.2. Reputation Function for Service Replica. Reputation-based function addresses one of the most critical issue in Grid Environment: QoS for grid-based services. Simulation and, in the future, implementation of Reputation solution over Proxy in Service Environments, will constantly follow to ensure QoS in term of execution times and performance. Solution will permanently monitor the “quality” of the grid and how it’s responding to consumers’ requests and will propose ways to choose either for “best (shortest) execution time” or for “most determinist execution time”. In the first approach, solution will try, based on execution history, to provide with the best service endpoint in term of execution performance. Second scenario will cover those consumers that care more about a determinist execution time rather than the shortest execution time. Allocation of Services is limited due to little information available for the Monitor. The replica selection algorithm doesn’t know whether a particular service is running a job or if has or not multiple jobs queued. Moreover, it doesn’t have a history of the completion times of the jobs. This makes difficult the prediction of the performance of Web Services. Allocation of services in grid can be improved with a help of a reputation system.

For replica selection we proposed a dedicated service to compute reputations. The service is a centralized one, which receives information with the completion times of the jobs or information about services failures and provides a degree of reputation, based on a metric for the QoS offered. When choosing an evaluation function for reputation calculation, a few issues there must be taken into consideration. Firstly, trust decays with time, according with the history of the quality of service provided. If, over time, the quality decreases (job execution times increase or job success rate decrease) then the function must be able to penalize it by a drop in reputation. Also, in the case of performance improvements, the reputation will grow.

This proposed solution based on reputation improves the service selection in the case of the same values for balancing metric for different replicas.

5. Test Scenarios and Experimental Results. We have realized experimental tests to highlight each term behavior of the proposed metric for balancing. The test conditions consider Lambda probe [9] integrated module write in log files every 30 seconds, balancing metric calculated every approximate 30 seconds (30 s some
sync times), an event takes place every 15 seconds (an event can be a request/error, event of GC or of memory scheduler, increasing/decreasing free memory etc). In all test we have used the same Tomcat container that mean that we consider the same resources. The experiments consider the following scenarious:

- Empty container
- Threads Alive
- Successful Requests
- Error requests
- Best Replica
- Many Requests

5.1. Empty container. The first scenario intends to measure the balancing metric evolving in time into an empty container. No service is running on this container, only default services from Apache Tomcat and services from monitoring tool Lambda Probe. Time of measuring is 30 minutes.

5.2. Threads Alive. The second scenario intends to measure the balancing metric evolving in time when increasing number of threads alive. Time of measuring is approximately 15 minutes. For testing we have used services with a longer uptime than the period of testing because we wanted to avoid altering the requests parameter which consequently would have increased the balancing metric.
As is illustrated in Figure 5.2 the balancing metric varies between 70 and 80 before the moment of busy threads increasing. After this moment, we have increased the number of busy threads and the balancing metric decrease down to 55. After 10 minutes (600 seconds) the value of balancing metric has slowly increased but the busy threads remained the same number. The balancing metric increased because the GC has cleaned the unused references objects and possibly memory provider has allocated extra memory for total memory (value of balancing metric reached 90).

5.3. Successful Requests. This test scenario intends to measure the balancing metric evolving in time when increasing number of successful requests. Time of measuring is approximately 11 minutes. For testing we have used services with an empty method named nothing because we wanted to avoid altering the busy threads parameter which consequently would have decreased the balancing metric.

![Fig. 5.3: Time evolution of balancing metric - Increasing successful requests](image)

As is illustrated in Figure 5.3 the balancing metric starts at 70 and increasing to 90, where is established. The second term of balancing metric represents also a trust parameter. The higher of this parameter is, the higher is trust level represented by P2 value. Default in our implementation number of requests is 1. We have made this initiation because we wanted to give half of trust to every replica. If we will have error requests (like in the next scenario) and default number of requests is 0, the second term of sum will be always 0 and the monitor service will choose at every moment first replica that has generated errors because it will not have a smaller value.

We can reach at a moment to every replica having the same value and this value cant decrease because the errors number is much higher than requests number. This means that $B_2$ term tends to 0. In this case we can choose the first replica, for example, even if we still send requests to it, the value of its balancing metric will not decrease, but this “problem” does not make us to choose another replica, because all other replicas are second term tended to 0, so these arent more confidence.

5.4. Error requests. This test scenario intends to measure the balancing metric evolving in time when increasing number of error requests. Time of measuring is approximately 12 minutes. For testing we have used services with a method that not exists on the container because we wanted to avoid altering the busy threads parameter which consequently would have decreased the balancing metric or other parameters like JVM CPU Usage.

As is illustrated in Figure 5.4 the balancing metric starts at 70 and increasing to 80 because JVM cpu usage begins to decrease. After about 100 seconds we begin to increase the request number that finished with errors. The balancing metric starts to decrease down to 62 where begins to established because the value of second term (P2) cant decrease more and the rest of terms are constantly (only GC alters sometimes the free memory percents and balancing metric varies by 3 or 4 percents.

This parameter is part of the trusted component (P2). As we can see in Figure 5.5, number of errors represents an important role in value of trust level. If a container begins to have errors it immediately decreases the value of trust (second parameter P2) and then even if it receives a high number of request that successfully
resolve them, the value of trust level increases very hard. In conclusion, it is recommended for a container to have the smallest number of errors from the first moments of activity.

5.5. **Best Replica.** This test scenario intends to measure the balancing metric evolving in time in a proxy system that forwarded the received request to the best replica of the moment, with the highest value of the balancing metric.

At the beginning moment replica with the best value of balancing metric is blue replica. Proxy monitor will forward to it the received request. Because blue replica finish with success all requests, it still receive requests from monitor Service. From 300 moment, blue replica finish with errors all requests and in this manner its balancing metric value decrease down to 79. In this moment replica with best value of balancing metric is green replica. It will receive all requests from monitor service and from the same reason, its value of balancing metric will increase up to 85, when at 450 (seconds) moment this value will decrease because received requests finished with errors. But the green replica still receive requests from monitor service, because it has the highest value of balancing metric (see Figure 5.6).

5.6. **Many Requests.** This test scenario intends to measure the balancing metric evolving in time when services container receives very many requests and its resources are tested to the fullest. As is illustrated in Figure 5.7 the balancing metric starts at 77 and increasing to 79 because JVM cpu usage begins to decrease. After about 60 seconds we begin to increase the request number that finished with errors and the requests that requires extra resources like cpu usage and are IO intensive. After this all requests finish. This scenario repeats...
for two times between 250 and 350 and respectively 350 and 420 periods.

6. Conclusions. Many of today’s applications follow the distributed computing paradigm in which parts of the application are executed on different network-interconnected computers. Examples include Web browsing and searching, Internet banking, enterprise applications (for accounting, production scheduling, customer information management), and grid applications (for data intensive or compute intensive processing). The last classes of applications are in the area of Scientific Computing. In this paper we presented a service-based architecture that uses a proxy and services replicas and we present the load-balancing metric used by proxy in order to select a service replica. Dependability remains a key element in the context of application development based on services and is by far one of the most important issues still not solved by recent research efforts.

The work presented in this paper is concerned by increasing reliability and availability, particularly in Grids and Web-based distributed systems. The presented solution presented is based on encapsulation of replicated distributed services in a container for masking the possible defects that may occur. Thus, for a client, a failure occurred is imperceptible, presented service being designed for masking possible errors and in transparent mode to redirect any received requests to another functional service/replica. Our solution uses a load-balancing system that ensures the use of resources more efficiently and reduces the time response.

Using a service by clients assume to know only the service address implemented in the same container with proxy service. This address remains unchanged even if other replicas of the service join in the system or leave from the system. Using transparent replication makes the system more scalable.

In the future we consider the possibility of extending the service implemented in several ways. First we will consider implementing a mechanism for Proxy service replication to eliminate the possibility of becoming a service insertion mechanism defects, that is to replicate and proxy service. Also, we want to integrate two
services: one to calculate the administrative distance between nodes where there are services (this is a maximum flow problem) and another for detecting a fall service/container. First service can help Monitor Service to take better decisions because the balancing metric will have a more realistic value and the second service will find possible failures in the system architecture and after proxy service will be capable to replicate dynamically the invoked request. Another important aspect will be focused on reputation function. We will consider a quantitative approach of this model and we will combine the balancing metric with reputation in the process of replica selection.

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