

# Toward Self-Optimization of Autonomic Systems

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# Introduction

French online income declaration service (2005)

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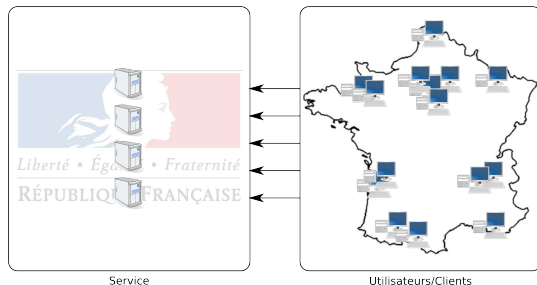
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- System capacity: 1,5 million users
- Actual load: 3,7 million users

**Bad capacity planning:  
System overloaded!**

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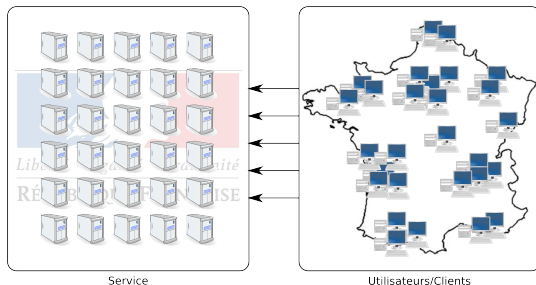
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- System capacity: 10 million users
- Actual load: 5,7 million users

**Sub-optimal capacity planning:  
almost 50% resources wasted!**

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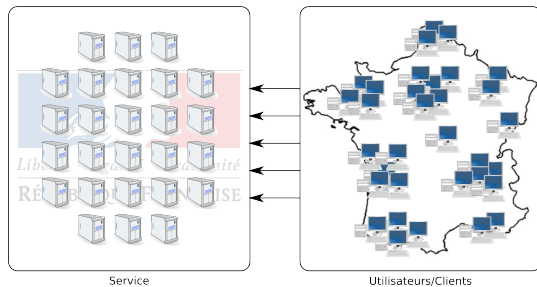
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- System capacity: 8 million users
- Actual load: 7.4 million users

**Optimal capacity planning!**

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## WorldCup'98 Web site

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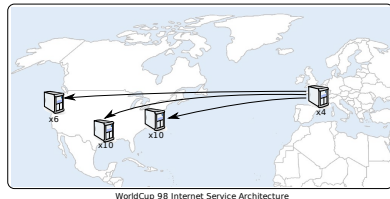
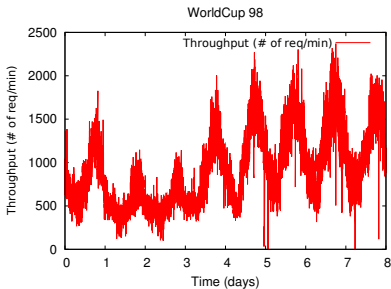
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- Dynamic workload: min/max load ratio =  $\times 4$
- Fixed system size: 30 servers
  - ▶ France Télécom, Hewlett Packard

# Challenges

Building self-optimized autonomic systems

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## System capacity planning

- Performance and availability guarantees
- Load variation
- Oscillations
- Legacy systems

## Dynamic software architecture

- Distributed systems
- Synchronized deployments
- Dynamic architectures

# Approach overview

## Autonomic Computing

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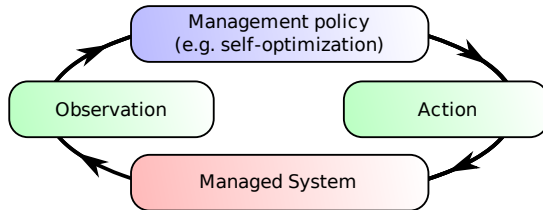
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## Self-Optimization of Dynamic Software Architecture



Feedback control-loop



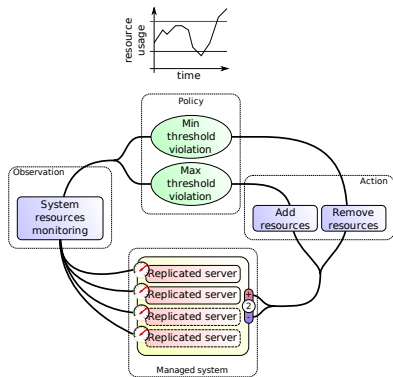


# Contributions

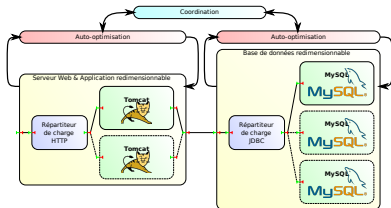
# Self-optimization policy

## Overview

- Feedback control-loop
- Threshold based policy
- Resource usage thresholds
- $\pm n$  resources



# Multi-tier Service Dynamic provisioning



- J2EE System
  - ▶ Web & Application: Apache Tomcat v5 (1 or 2 instances)
  - ▶ Database: MySQL v5 & Sequoia (from 1 to 3 instances)
- Benchmark: RUBiS (eBay)
  - ▶ Gradual load variations

# Gradual load variations

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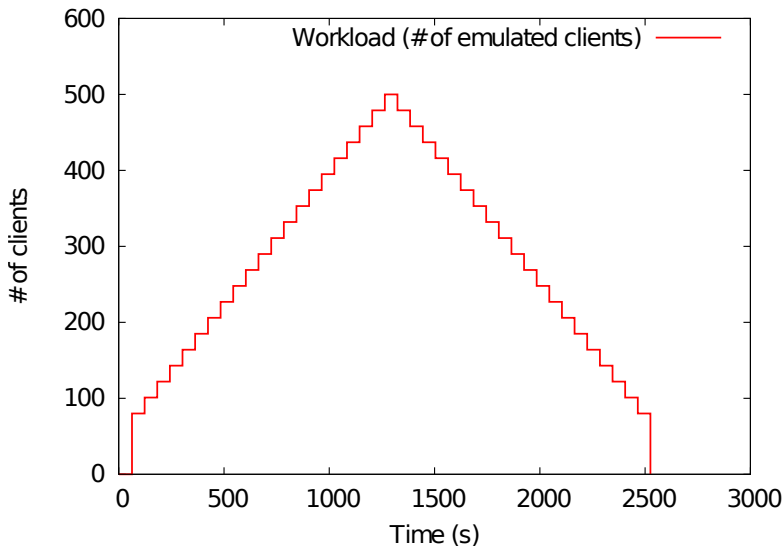
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# System behaviour

## Database servers

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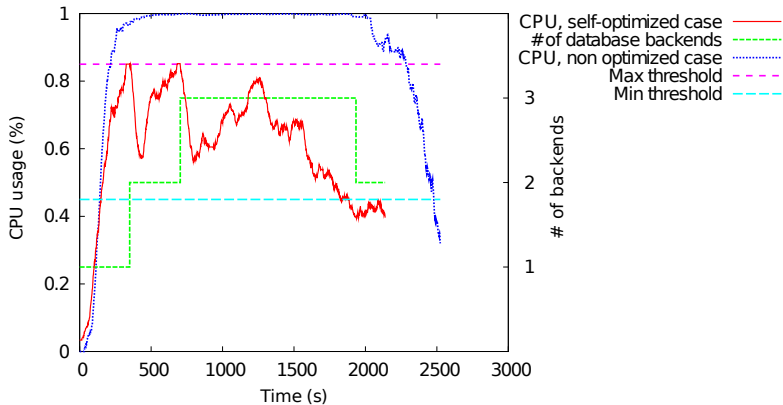
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# System behaviour

## Web & Application servers

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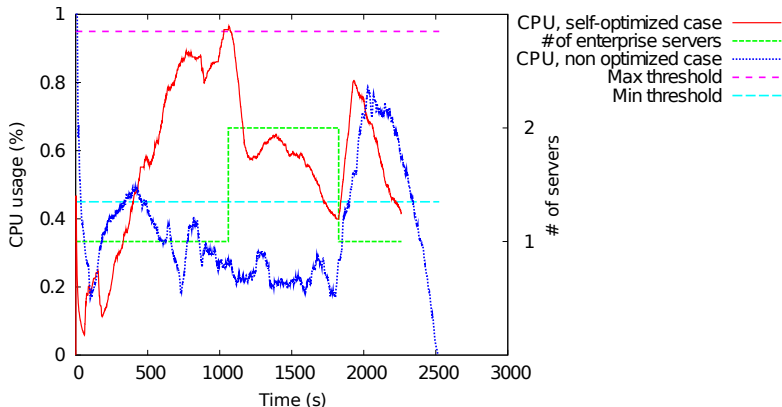
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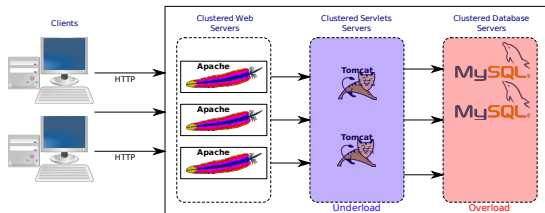
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# Oscillations

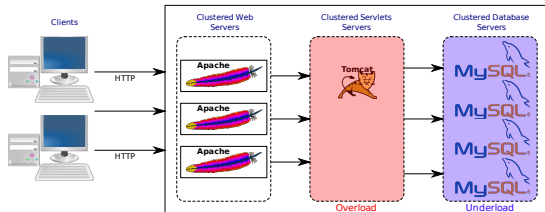
## Example (1)



- Sub-system dependencies
  - ▶ X directly linked to Y
  - ▶ X overload may induce Y underload
- Harmful uncorrelated separate reactions
  - ▶ Over/Under-load: add/remove resources

# Oscillations

## Example (2)



- Sub-system dependencies
  - ▶ X directly linked to Y
  - ▶ X overload may induce Y underload
- Harmful uncorrelated separate reactions
  - ▶ Over/Under-load: add/remove resources



# Oscillation prevention

## Related work

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- Global inhibition delay (Cluster-on-Demand) [Moore et al., 2002]
  - ▶ Freeze of the whole system
- Fake resource removal (Chameleon) [Soundararajan et al., 2006]
  - ▶ Database specific approach
- Control theory approaches [Hellerstein et al., 2004]
  - ▶ Accurate system modeling

# Approach toward oscillation prevention

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## Design principles

- Architecture knowledge
- Sub-system dependencies identification
- Allow coordination
- Reconfiguration inhibition for systems with direct dependencies

## Implementation

- Jade autonomic management platform
- Fractal software components
- Self-optimization manager with oscillation prevention

# Implementation

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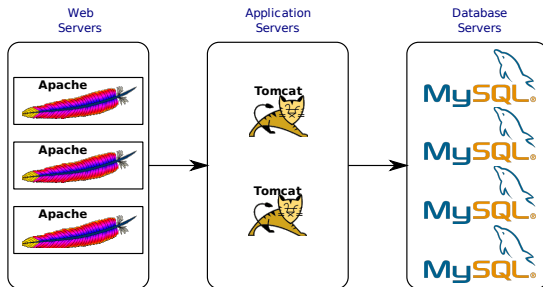
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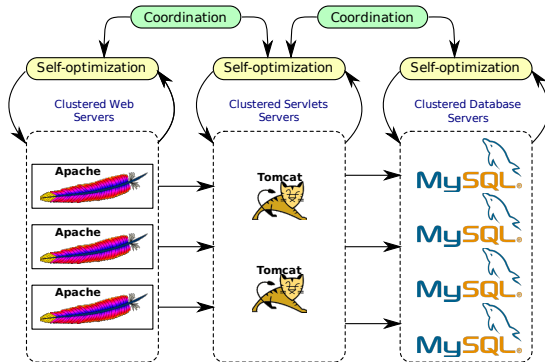
## Principles

- Components represent sub-systems
- Bindings symbolize dependencies



# Implementation

## Self-optimized J2EE Internet Service



Dynamic provisioning inhibition rule

Resizing on Database servers  
inhibits

Resizing on Application and Database servers

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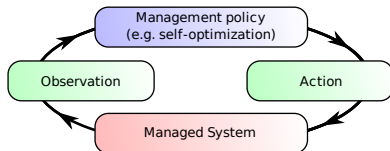
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- Contributions
  - ▶ Self-optimization policy
  - ▶ **Actions**
  - ▶ Observations
- Conclusions & Perspectives



# Architecture Description Language (ADL)

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## Architecture Description Language

- **System elements: Components**

```
<component name="my-component" ...> ... </component>
```

- **Sub-system relationships: Interfaces and Bindings**

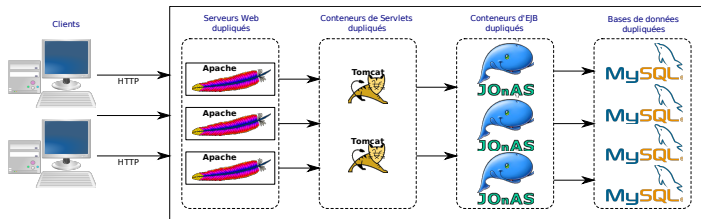
```
<binding name="my-binding"  
    client="my-client-itf" server="my-server-itf" .../>
```

## Deployment

### ADL instantiation process

# Distributed deployment synchronization

## Example



## Distributed deployment of a complex architecture (Multi-tier J2EE)

- What if we parallelize all deployments?
- Invariant: backends started before frontends
- Dependencies through architecture

# Related work

## Distributed deployment coordination

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- Deployment synchronization encoded in factories (Fractal ADL/Julia Factories) [Bruneton et al., 2006]
- Factory parameter (Prism) [Mikic-Rakic et al., 2005]
- Simple ADL parameter (ProActive) [Caromel et al., 2007]
  - ▶ Does not allow arbitrary synchronizations
- Generated deployment procedure (IA Planning or Constraints solving) [Arshad, 2006]
  - ▶ No control on synchronization
- Workflow languages (SmartFrog, BPEL) [Goldsack, 2003] [Keller et al., 2004]
  - ▶ Not applicable to architecture deployments



# Approach

## Distributed deployment synchronization

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### Design principles

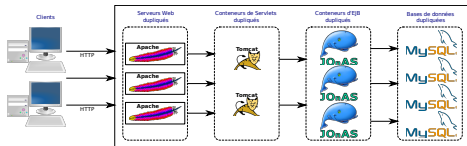
- Package
  - ▶ Description, deployment and architectural unit
  - ▶ 1<sup>st</sup>-class programming language entity
  - ▶ Deployment procedure
- Distributed deployment
  - ▶ Coordination and synchronization of local package deployments

### Implementation

- Mozart/Oz distributed platform
  - ▶ Using Oz synchronization abilities
- FructOz framework
  - ▶ Fractal component model

# Implementation

## Synchronized distributed deployment



```
proc {DeployJ2EE NWebs NServlets NEJBs NDBs}
  {Barrier {MakeList NDBs DeployDB}}
  % Require all DB servers up
```

```
{PartialBarrier {MakeList NEJBs DeployEJB} (NEJBs/2)}
% Ok when 1/2 EJB servers are up
```

```
{Barrier {MakeList NServlets DeployServlet}}
% Require all Servlet servers up
```

```
{PartialBarrier {MakeList NWebs DeployWeb} 1}
% Ready as soon as one Web server instance is up
```

```
end
```

# Distributed deployment

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## Database deployment procedure

*% Set of DB servers initially empty*

DBTier = {SNew}

*% Deployment procedure for a single DB server*

**proc** {DeployDB}

Host = {AllocateHost Cluster}

DB = {RemoteDeploy Host DBPkg}

**in**

{DBTier add(DB)}

**end**

# Synchronization barrier

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## Partial synchronization barrier

```
proc {PartialBarrier LDeploys N}
  Continue % Synchronization signal (undefined yet)
  Counter = {NewCell N} % Counter initialized to N
in
  for Deploy in LDeploys do
    thread % Start all deployment procedures in separate threads
      {Deploy}
      local % Thread—safe counter decrement
        NewCount PreviousCount = {Exchange Counter NewCount}
      in
        if (PreviousCount > 0) then
          NewCount = PreviousCount - 1
          if (NewCount == 0) then
            Continue = true % Synchronization signal when counter reaches 0
          end
        end
      end
    end
  end
end
{Wait Continue} % Wait until synchronization signal is defined
end
```



# Dynamic architecture instrumentation

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## Design principles

- Dynamic architecture as a 1<sup>st</sup> class citizen
- Dynamic computation model

## Implementation

- Integration with FructOz
  - ▶ Fractal components
  - ▶ Architectural constructions
- LactOz library of navigation primitives

# Clustered service monitoring

## Example

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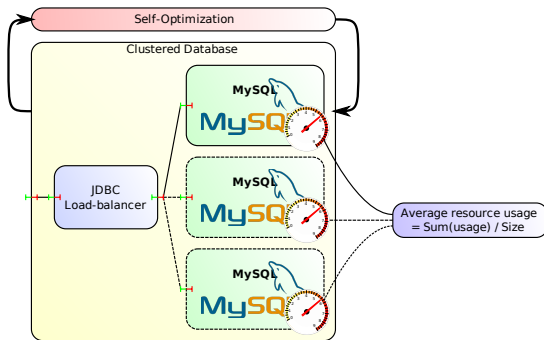
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## Challenge

- Dynamic set of nodes to monitor
- Monitoring system adaptations

# Dynamic architecture instrumentation

## Related work

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- Navigation and scripting DSL: Fractal  
FPath/FScript/ECA (Safran) [David, 2005]
  - ▶ Reactions only
- Active database: Triggers, Views, ECA rules
  - ▶ Not distributed & Database specific



# Dynamic components as 1<sup>st</sup> class citizen

## Dynamic monitoring instrumentation

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```
%% Dynamic monitoring architecture
fun {MonitoringPkg SComponents}
  %% Set of nodes hosting the components
  SHosts = {SMap SComponents CGetHost}

in
  functor $
  export Membrane
  define
    C = {CNew nil}

    %% Deploy the monitoring information aggregator
    Aggregator = {Deploy AggregatorPkg}
    {CAddSubComponent C Aggregator}

    %% Deploy a dynamic set of sensors on every host
    SSensors = {ClusteredDeploy SHosts SensorPkg}

    %% Bind all sensors to the aggregator
    SAggregators = {SSingleton Aggregator}
    {ApplyBindingScheme FullInterconnect SSensors SAggregator}

    Membrane = C
  end
end
```

# Deployment on a dynamic set of hosts

## Dynamic monitoring instrumentation

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```
%% Deploy the given component (Package) on each host in the given set of hosts
%% Each component instance is made sub-component of the given Parent component
fun {ClusteredDeploy SHosts Package}
  %% Class for an implicit component set mapped over SHosts
  class ComponentSet from ImplicitSet
  ...
  %% Adding some hosts
  meth addHosts(SElements)
    {FSet.forAll SElements % for every new host
      proc {$ Host}
        % remotely deploy a component instance
        SubComp = {RemoteDeploy Host Package}
        % add the component to the implicit set
        Set.add(SubComp)
      end}
    end
  ...
end
in
  %% Instantiate the implicit set
  {New ComponentSet init}
end
```

# Conclusion

# Summary of the problems

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## Problem

### Self-Optimization of Autonomic Systems

- System provisioning optimization and coordination
- Distributed deployment of architectures
- Dynamic architecture instrumentation

# Summary of the contributions

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## Jade self-optimization manager

- Simple threshold-based policy
- Architecture-based coordination

## FructOz framework

- Higher Order ADL (Package)
- Synchronization of distributed architecture deployments

## LactOz library

- Distributed dynamic computation model
- Dynamic architectures

# Perspectives

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## Self-optimization policies

- Toward self-stabilizing control-loop parameters
- Modeling

## FructOz & LactOz

- Transactional architecture manipulation
- (Self-)Optimization of dynamic computations
- Architecture checking (typing)
- Syntactic sugar (package, architectural entities, dynamic variables)

# Main results

## Code

Jade prototype:	Java code	23 kloc in 150 classes
	Fractal ADL	250 loc in 70 files
	Experimentations	20 nodes cluster
FructOz/LactOz:	Oz code	10 kloc in 90 files
	Experimentations	16 nodes cluster

## Publications

- Bouchenak et al., Int. Conf. on Cluster Computing, 2006
- Taton et al., Int. Conf on Dist. Objects and Applications, 2007
- Bouchenak et al., Encyclopedia of Database Systems, 2008
- Taton et al., Int. Journal on Autonomic Computing, 2008
- Stefani and Taton, Technical Report, 2008

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# Appendix

# Références I



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7th Int. Symposium on Component-Based Software Engineering, 2004.



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*SmartFrog: Configuration, Ignition and Management of Distributed Applications.*

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In *Proceedings of Integrated Network Management*, 2001.



G. Soundararajan and C. Amza.

*Autonomic Provisioning of Backend Databases in Dynamic Content Web Servers.*

Technical report, Dept. of Electrical and Computer Engineering, University of Toronto, 2005.



B. Urgaonkar and P. Shenoy.

*Sharc: Managing CPU and Network Bandwidth in Shared Clusters.*

*IEEE Transactions on Parallel and Distributed Systems (TPDS)*, 2004.



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*Cluster Reserves: a mechanism for resource management in cluster-based network servers.*

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# Références II



N. Arshad et al.

Deployment and Dynamic Reconfiguration Planning for Distributed Software Systems.  
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*Développement de composants Fractal adaptatifs: un langage dédié à l'aspects d'adaptation.*  
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