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THE 2009 OUTSTANDING  
RESEARCH FACULTY AWARD RECIPIENT

**Daniel A. Menascé**

Senior Associate Dean  
Professor of Computer Science

## The Importance of Models in the Design and Analysis of Computer Systems

**November 19, 2009**

3 p.m.

Lecture, followed by reception



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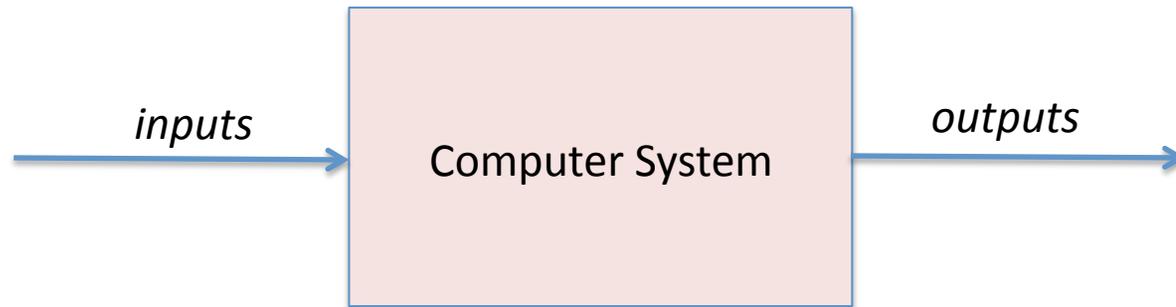
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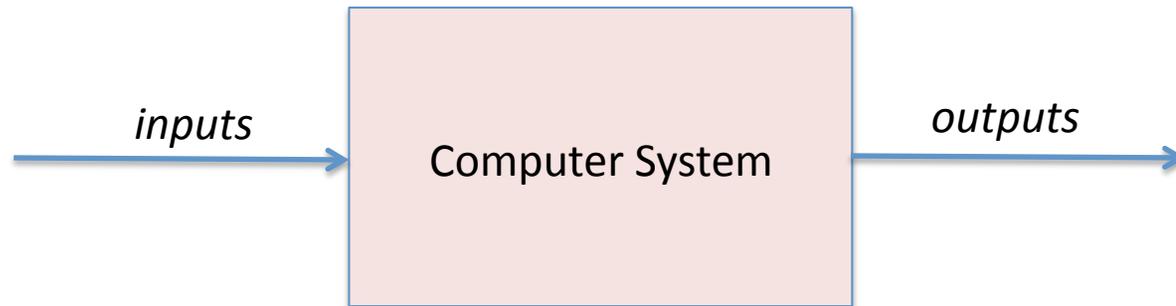
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Two important design questions:

Question 1: What functions will the system accomplish?



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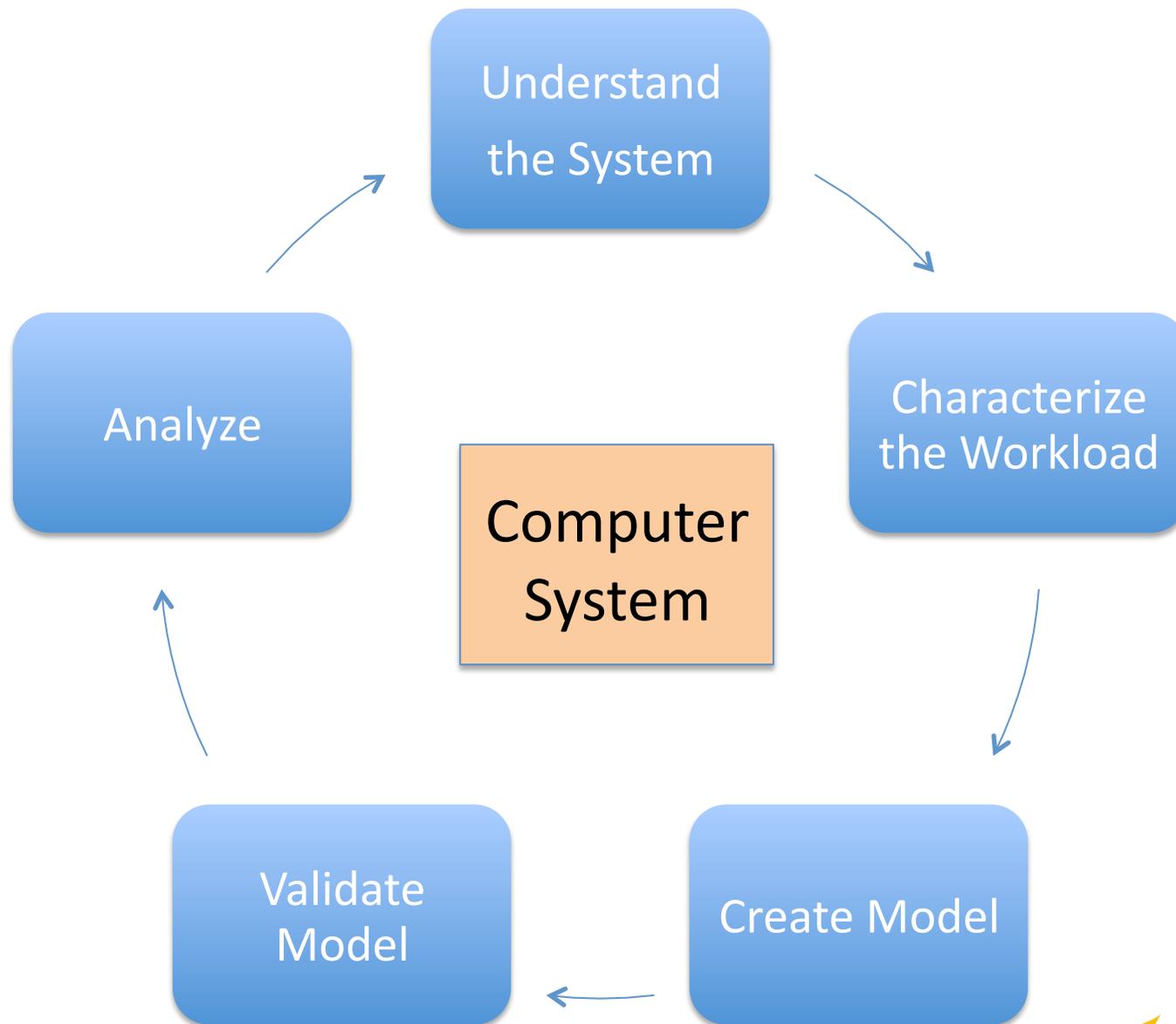
Question 2: How well will the system accomplish these functions?

- How fast?
- How reliably?
- With what level of security?
- In general, with what Quality of Service (QoS)?

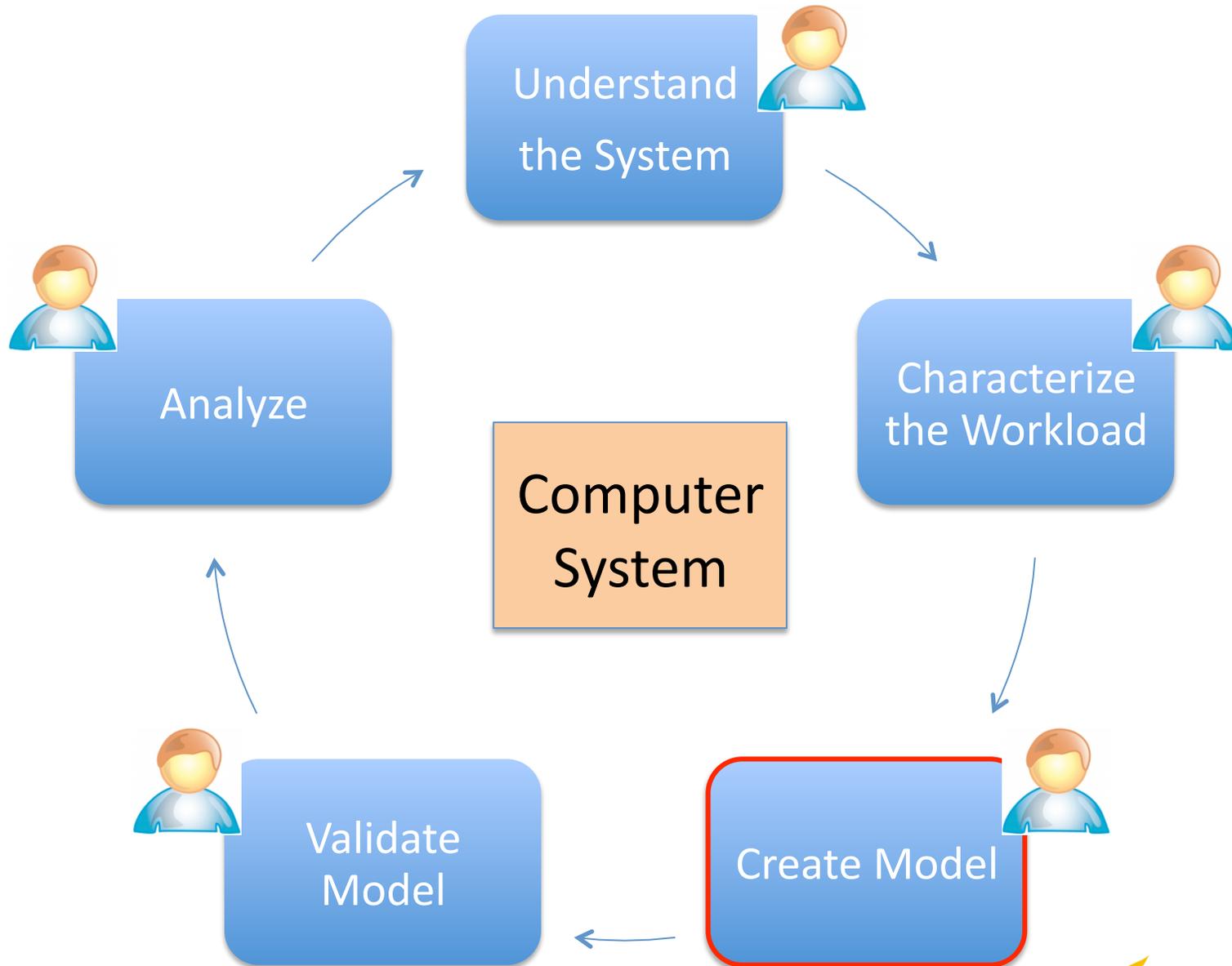
Part I

# PEOPLE CREATE AND USE MODELS OF COMPUTER SYSTEMS

# Computer Modeling Methodology



# Computer Modeling Methodology



# Some Formulas ...



$$\bar{t}^2 = \frac{F_s^2 \bar{I}^2}{C_s^2} + 2 \frac{F_s F_p (\bar{I})^2}{C_s C_p (P-1)} \sum_{i=1}^{P-1} \frac{1}{i} + \frac{F_p^2 (\bar{I})^2}{C_p^2 (P-1)^2} \left( \sum_{i=1}^{P-1} \frac{1}{i^2} + \left( \sum_{i=1}^{P-1} \frac{1}{i} \right)^2 \right)$$

$$e = \frac{pP_0}{\lambda} \left\{ \frac{c\lambda^c}{\gamma_1 \dots \gamma_c \left(1 - \frac{\lambda}{\gamma_c}\right)} + \sum_{k=1}^{c-1} \frac{k\lambda^k}{\gamma_1 \dots \gamma_k} \right\}$$

$$D_{i,g_i}^j = p_h (1/STR) \left[ (seek_j + lat_j) \phi(g_i) + \frac{blocksize_d}{trate_j} \left\lceil \frac{filesize_{g_i}}{blocksize_d} \right\rceil \right]$$

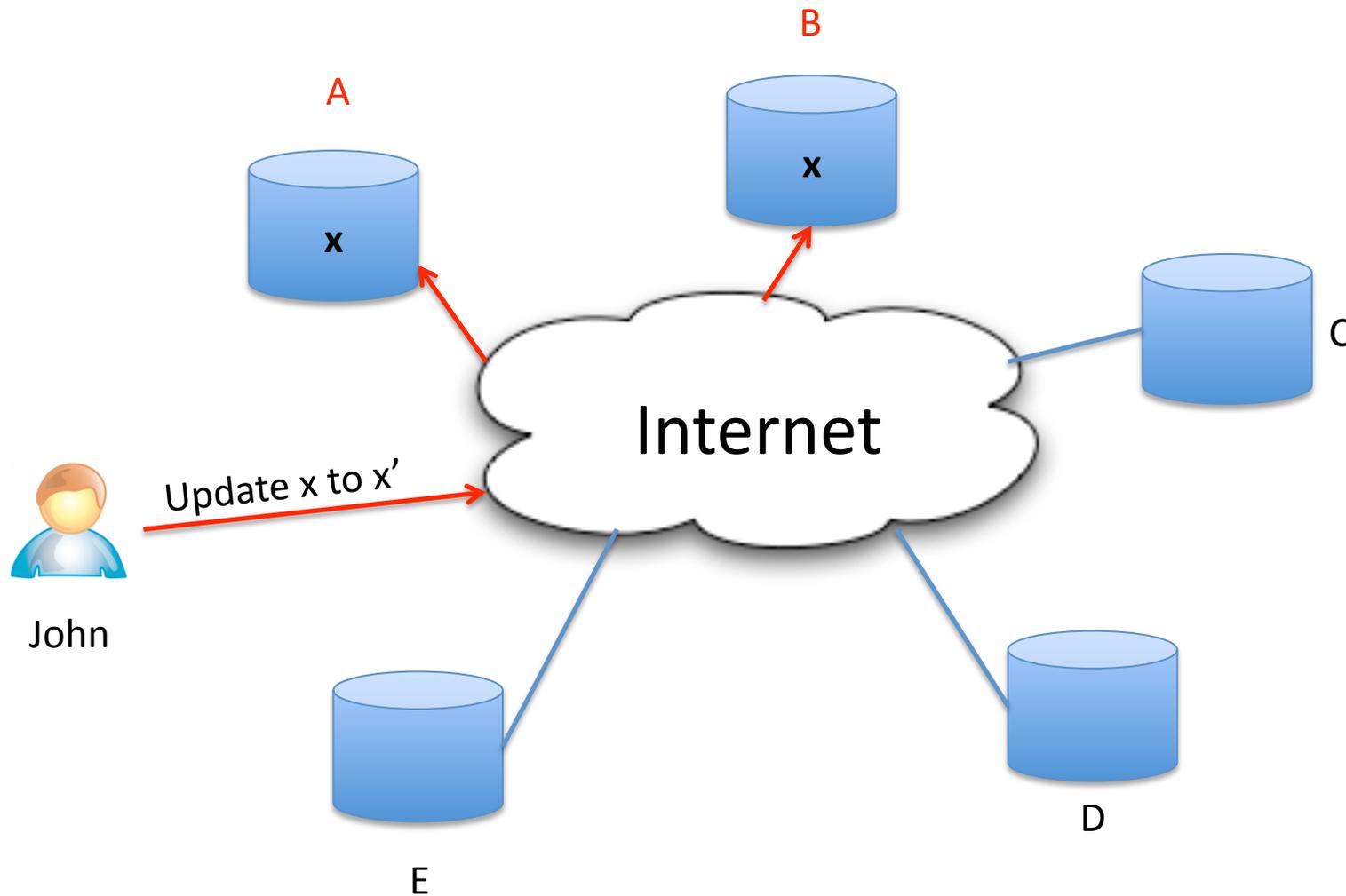
$$C_{IO}(\text{sort}_2) = 2 \times D_2 \times \lceil \log_M D_2 \rceil \times S_{IO}^{\text{grand}}.$$

$$p_{x_1+\dots+x_n}(x) = \sum_{k=1}^n \frac{\lambda_1 \dots \lambda_n}{\sum_{i=1}^n \prod_{j=1, j \neq i}^n (-\lambda_k + \lambda_j)} e^{-\lambda_k x}$$

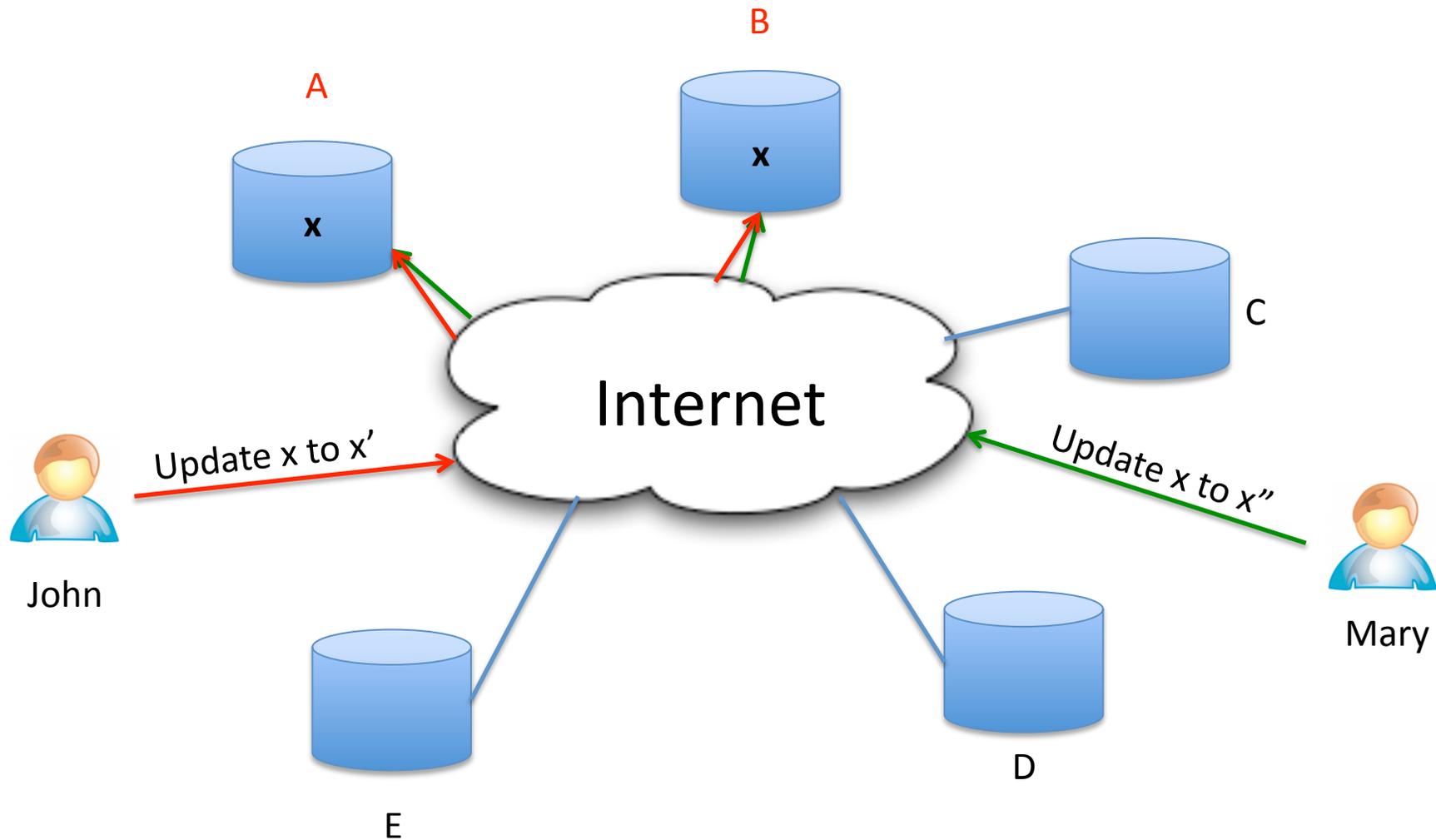
# Traveling through memory lane ...



# Concurrency Control in Database Systems



# Concurrency Control in Database Systems



## A Locking Protocol for Resource Coordination in Distributed Databases

DANIEL A. MENASCE, GERALD J. POPEK, and RICHARD R. MUNTZ  
University of California at Los Angeles

A Locking Protocol for Resource Coordination • 121

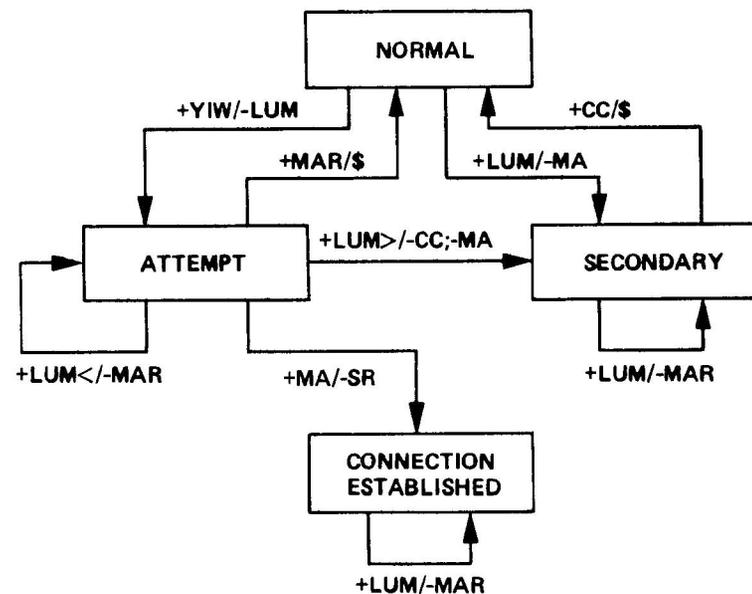


Fig. 3. State transition diagram for P-S connection establishment. A plus (+) sign indicates reception of a message and a minus (-) sign indicates transmission of a message. The sign < indicates that the message in question originates from a lower priority source, while > indicates a higher priority site. The dollar sign indicates that no action is taken due to a state transition.

Information Systems, Vol. 7. No. 1 (1982).

## OPTIMISTIC VERSUS PESSIMISTIC CONCURRENCY CONTROL MECHANISMS IN DATABASE MANAGEMENT SYSTEMS

DANIEL A. MENASCÉ and TATUO NAKANISHI

Departamento de Informática, Pontifícia Universidade Católica do Rio de Janeiro, Brasil



Locking-oriented  
concurrency control

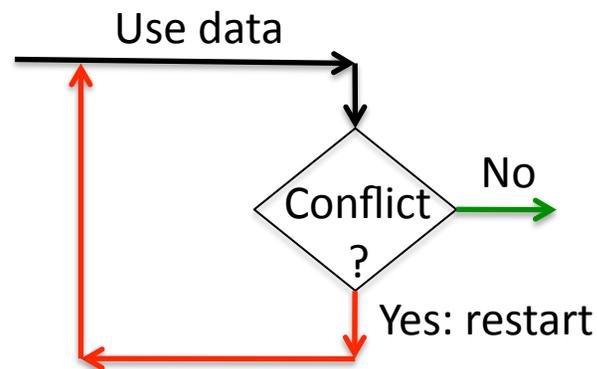
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Conflict-oriented  
concurrency control

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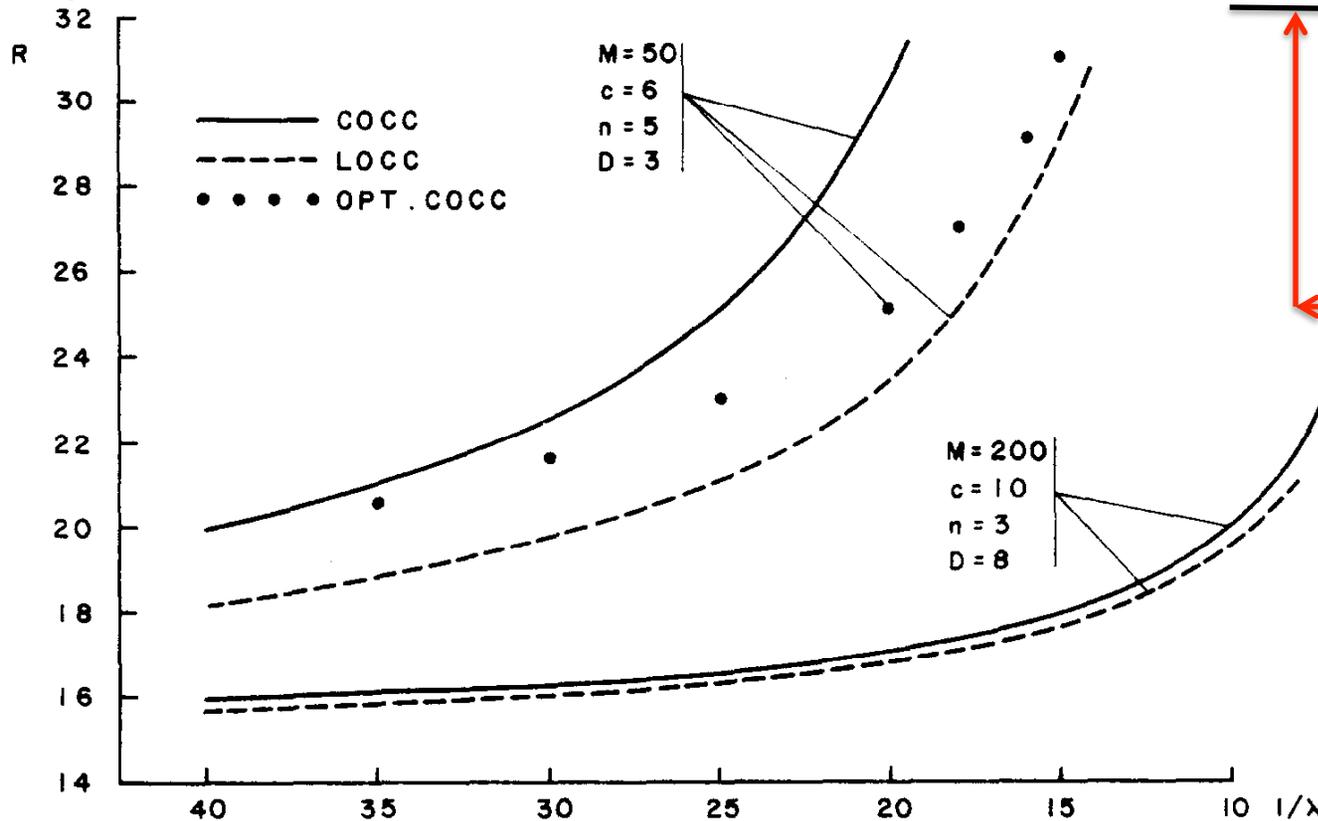
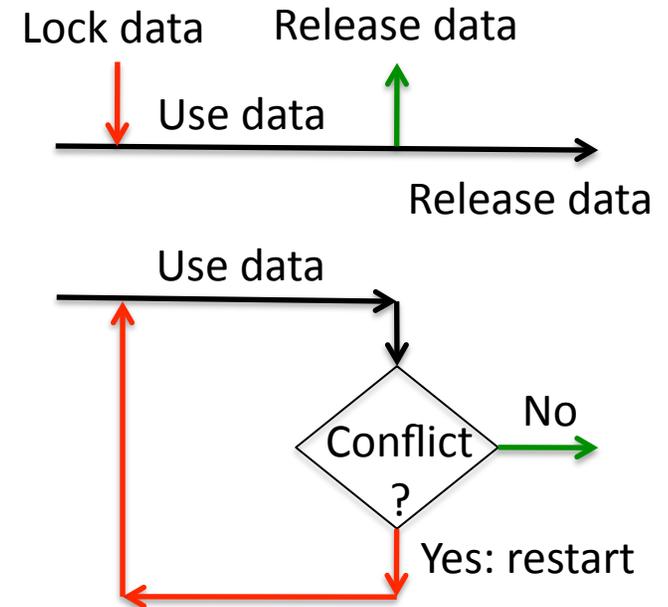


Fig. 17. COCC vs LOCC ( $q = 0.2$ ;  $1/\mu_{CPU} = 2.5$ ;  $1/\mu_{IO} = 2.5$ ).

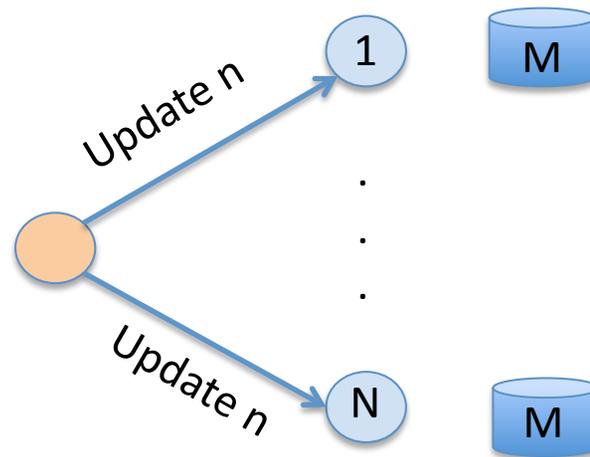


- Locking always outperforms conflict-oriented concurrency control.

Computer Performance Journal, March 1984.

# Correctness and performance evaluation of a two-phase commit-based protocol for DDBs

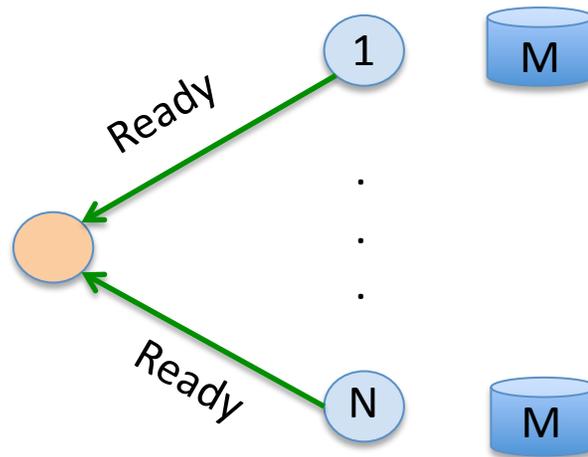
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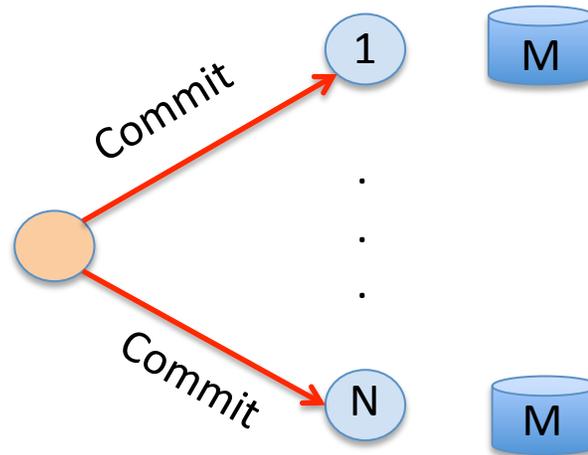
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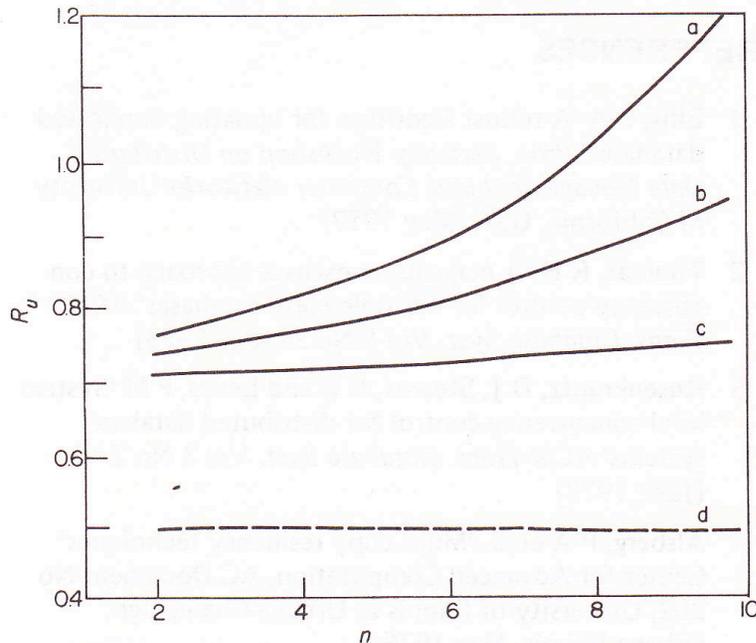
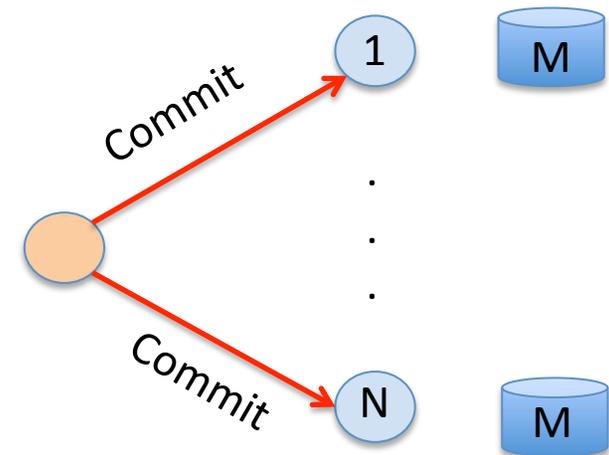
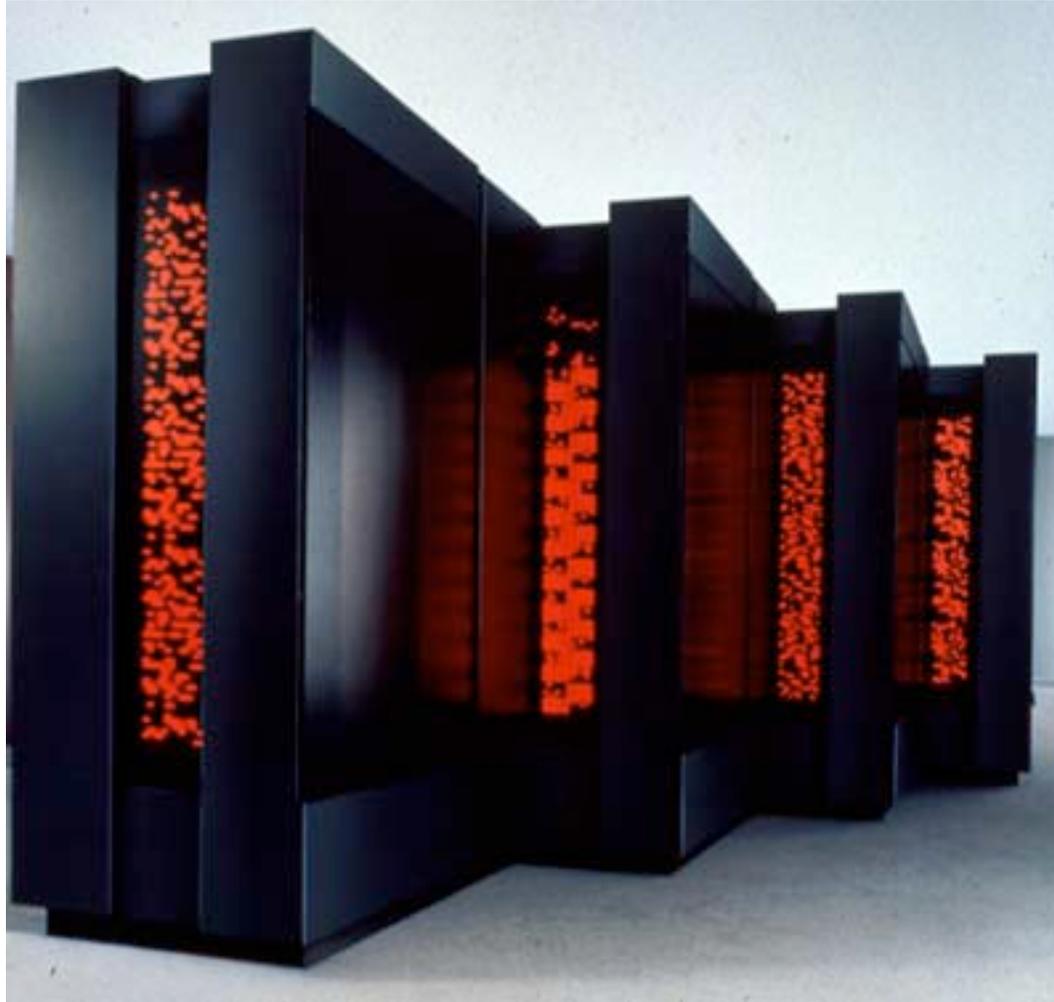


Figure 7. Average response time,  $R_u$ , against number of transaction resources,  $n$ ;  $N = 6$ ,  $M = 200$ ,  $D = 3$ ,  $T = 0.1$ ,  $RD = 0.5$ ,  $p = 0.2$ ,  $1/\mu_{cpu} = 0.005$ ,  $1/\mu_{io} = 0.025$ ,  $1/\lambda_r = 5.0$ ; (a)  $1/\lambda_u = 3.0$ , (b)  $1/\lambda_u = 5.0$ , (c)  $1/\lambda_u = 20.0$ , (d)  $R_u^e$



The model calculates the performance of read and update transactions as a function the workload intensity, number of nodes, and number of data items being updated.

# Supercomputing and Parallel Processing



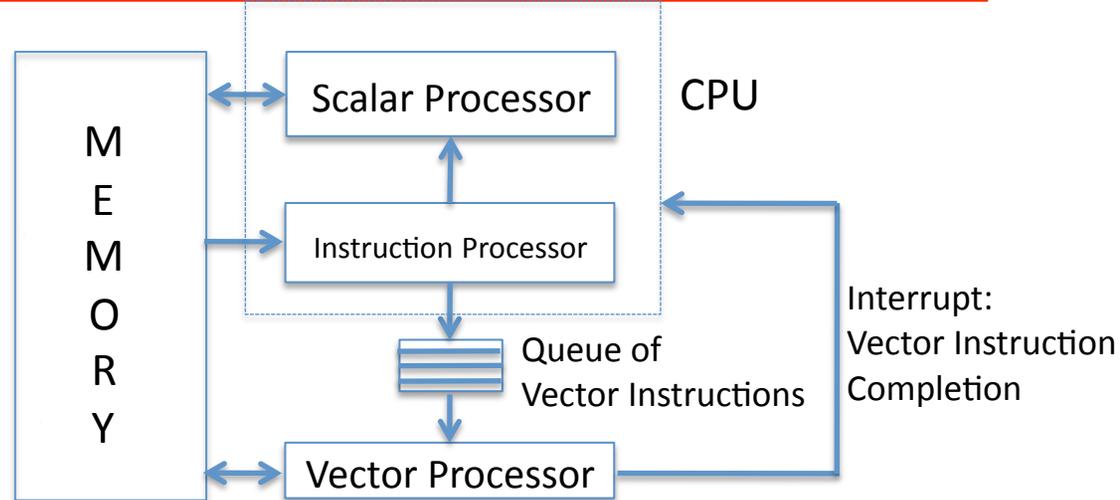
**ANALYTIC MODELS OF SUPERCOMPUTER PERFORMANCE IN MULTIPROGRAMMING ENVIRONMENTS**

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COMPUTAÇÃO  
UNIVERSIDADE FEDERAL DE MINAS  
GERAIS  
30161 BELO HORIZONTE, BRAZIL



Vector instructions are queued up if no vector unit is available and the running task is suspended.

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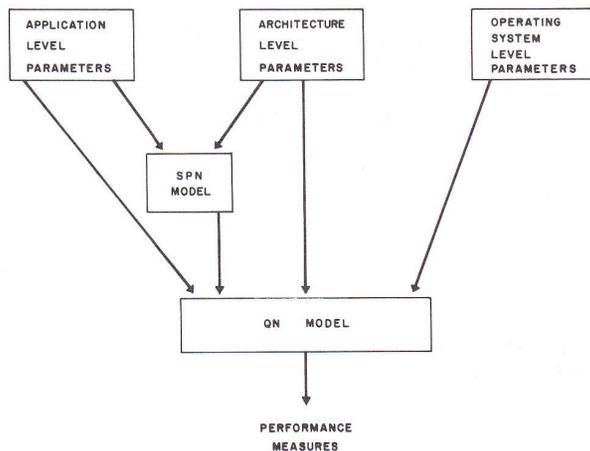
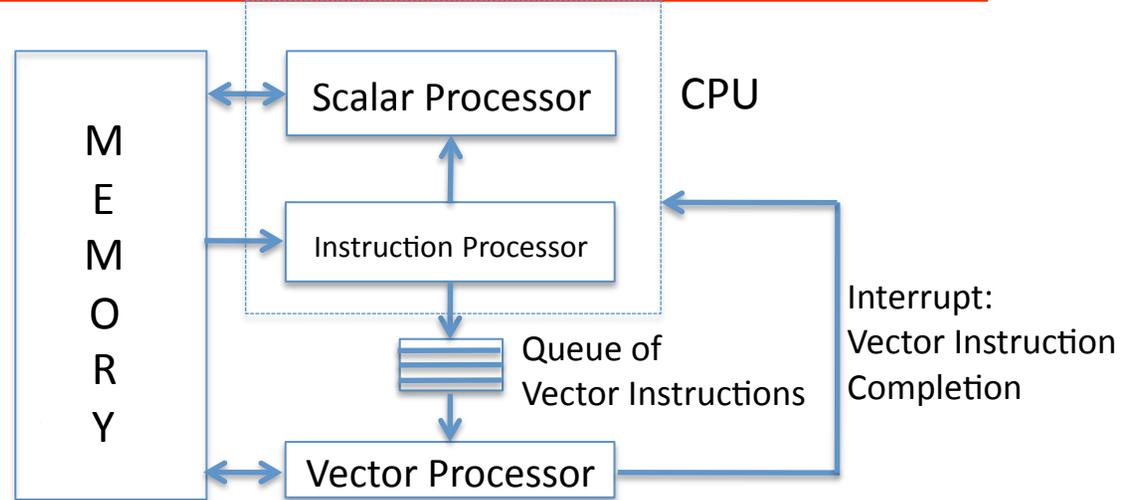


Fig. 4 Two-level modeling approach

Detailed analytic model of the architecture using Stochastic Petri Nets and Queuing Networks.

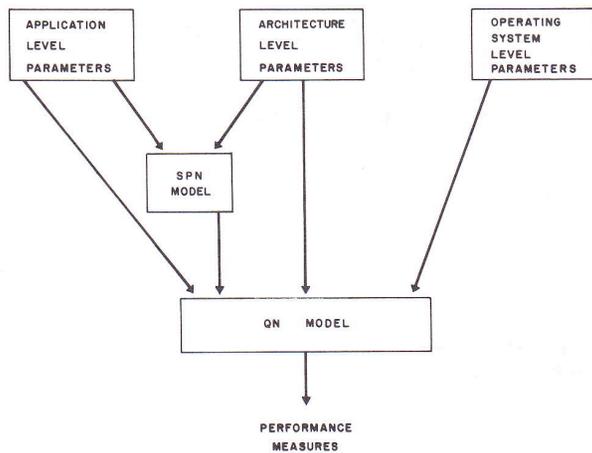
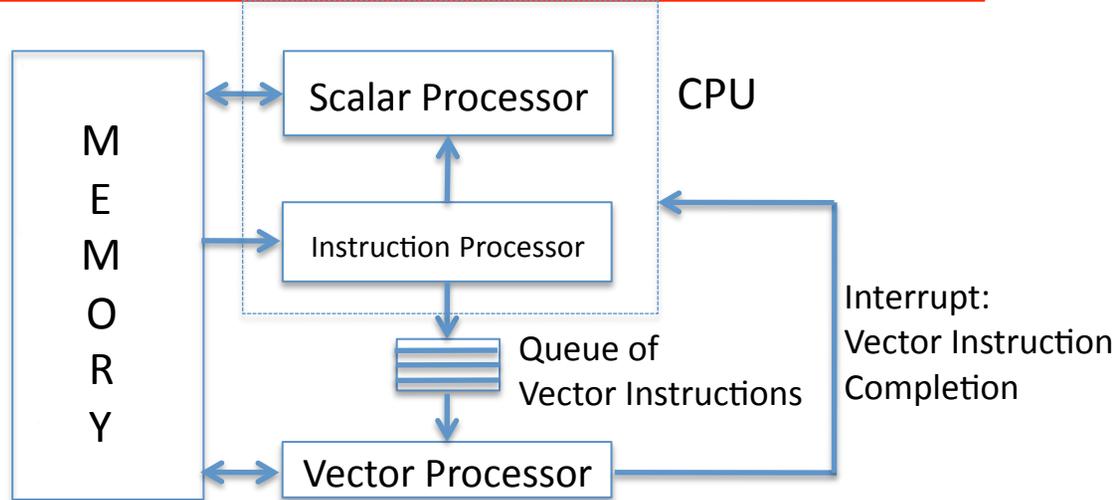
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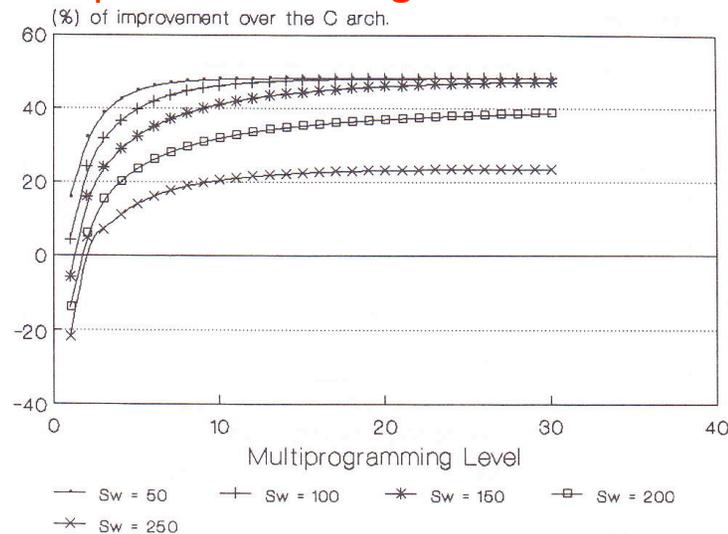
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**Fig. 4 Two-level modeling approach**

**% Improvement Ranges from 20% to 50%**



**Fig. 10 Response time improvement for various values of Sw**

## Cost-Performance Analysis of Heterogeneity in Supercomputer Architectures\*

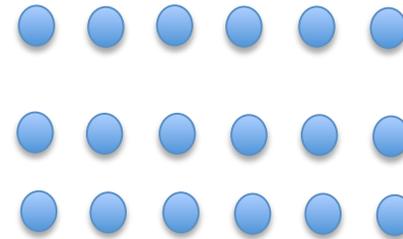
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*Homogeneous architecture*



## Cost-Performance Analysis of Heterogeneity in Supercomputer Architectures\*

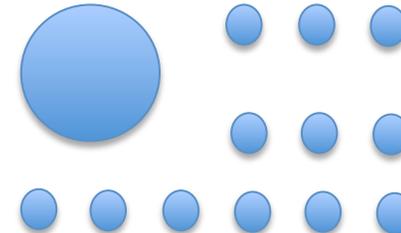
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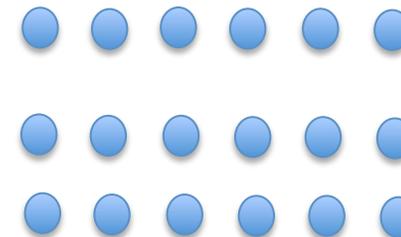
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### *Heterogeneous architecture*



### *Homogeneous architecture*

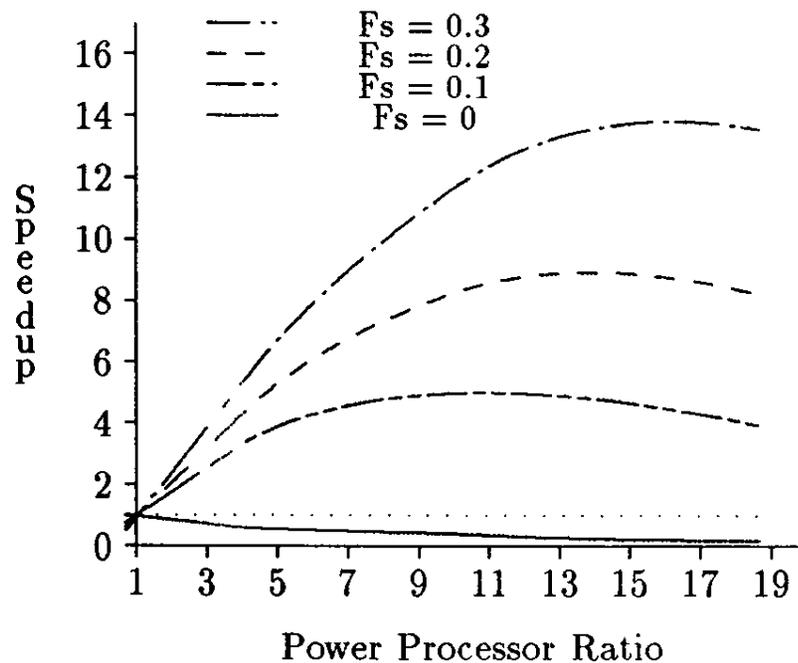
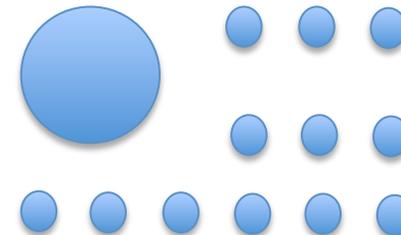


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### Heterogeneous architecture

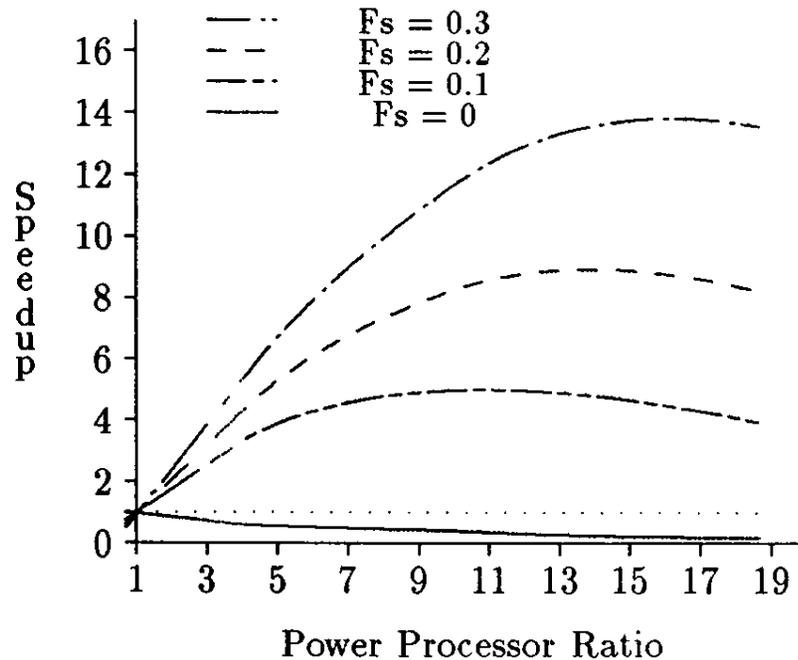
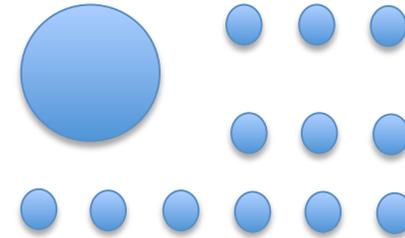


Speedup = (Execution time on homogenous architectures) / (Execution time on cost equivalent heterogeneous architecture)

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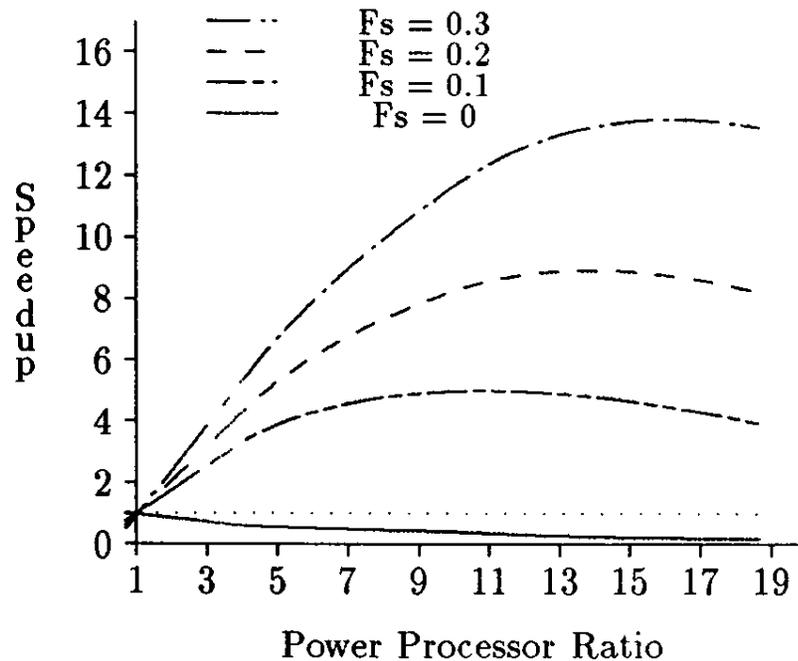
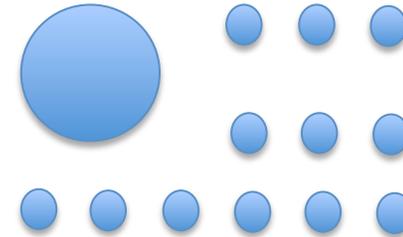
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- Homogeneous architectures are better for purely parallel applications ( $F_s = 0$ ).

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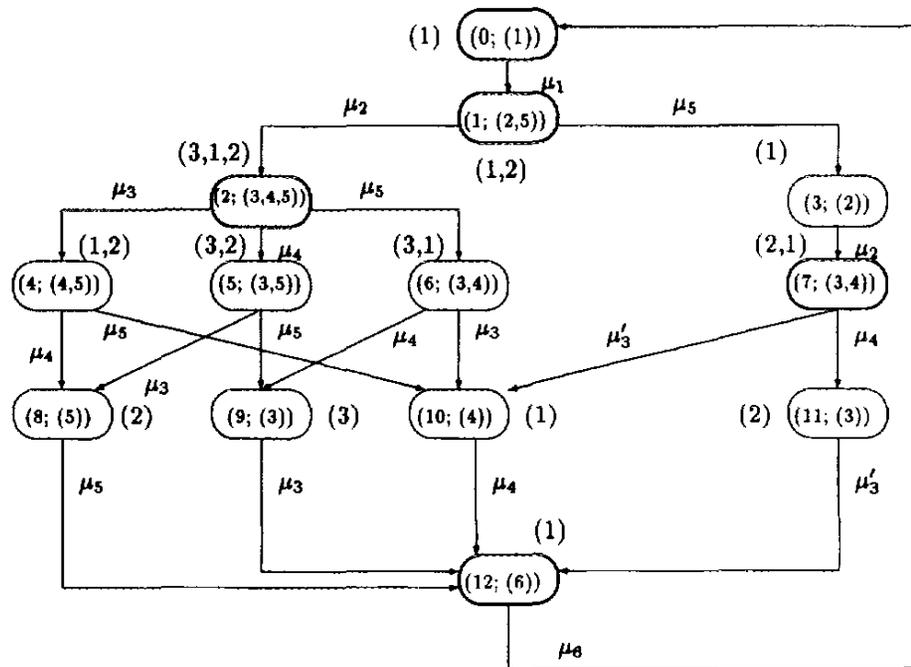


Speedup = (Execution time on homogenous architectures) / (Execution time on cost equivalent heterogeneous architecture)

- Homogeneous architectures are better for purely parallel applications ( $F_s = 0$ ).
- **As the fraction of sequential processing increases, the heterogeneous architecture outperforms the homogeneous one.**

# Static and Dynamic Processor Scheduling Disciplines in Heterogeneous Parallel Architectures

DANIEL A. MENASCÉ,<sup>\*,1</sup> DEBANJAN SAHA,<sup>†</sup> STELLA C. DA SILVA PORTO,<sup>‡</sup> VIRGILIO A. F. ALMEIDA,<sup>§</sup> AND SATISH K. TRIPATHI<sup>†,2</sup>



Automatically Generated Markov Chain

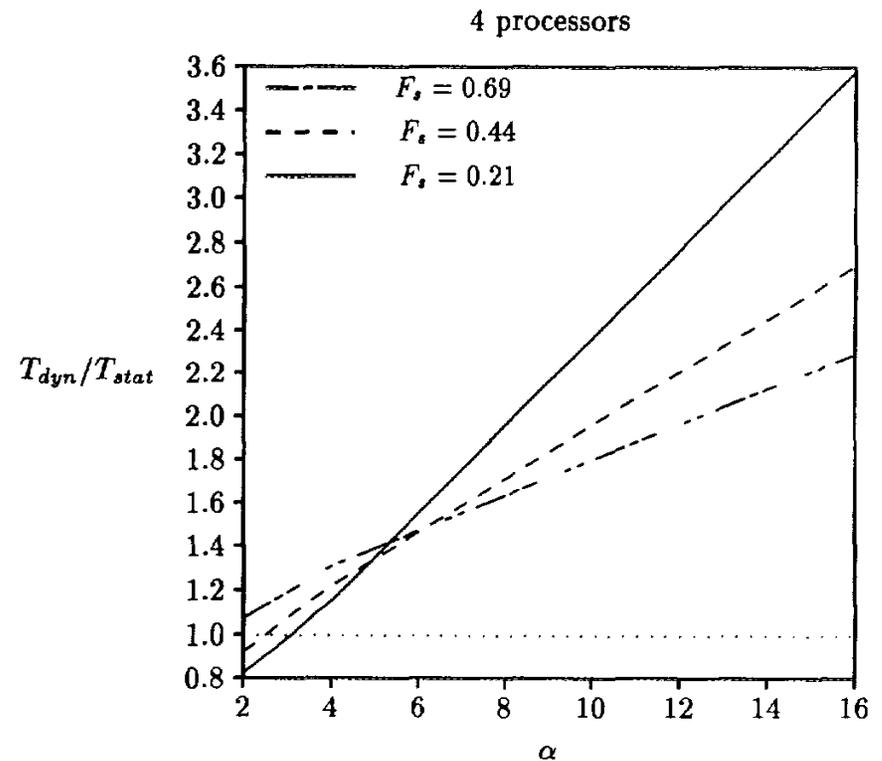
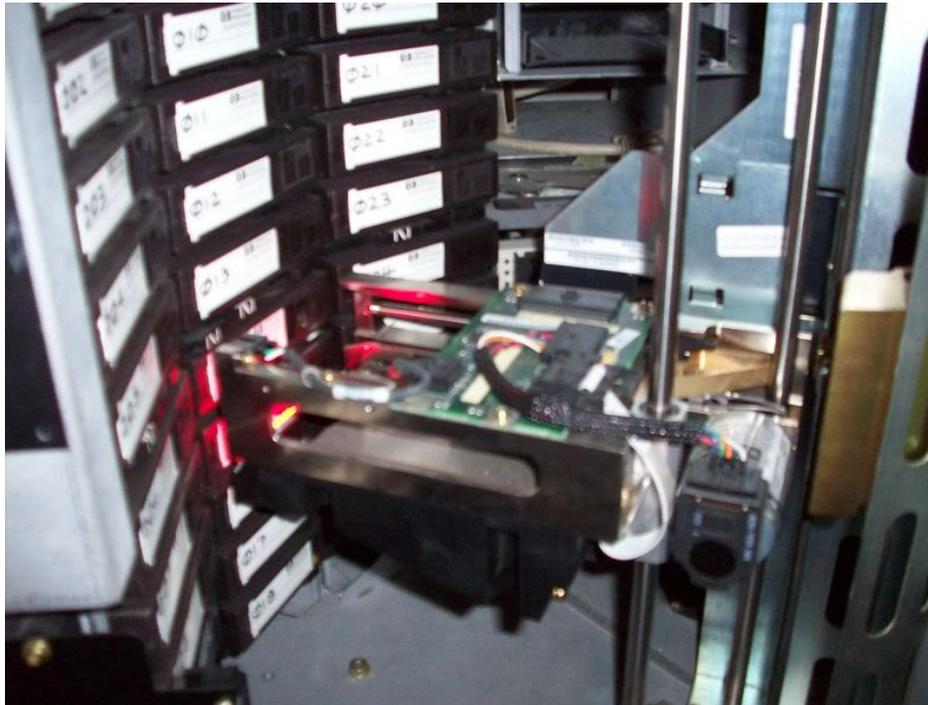


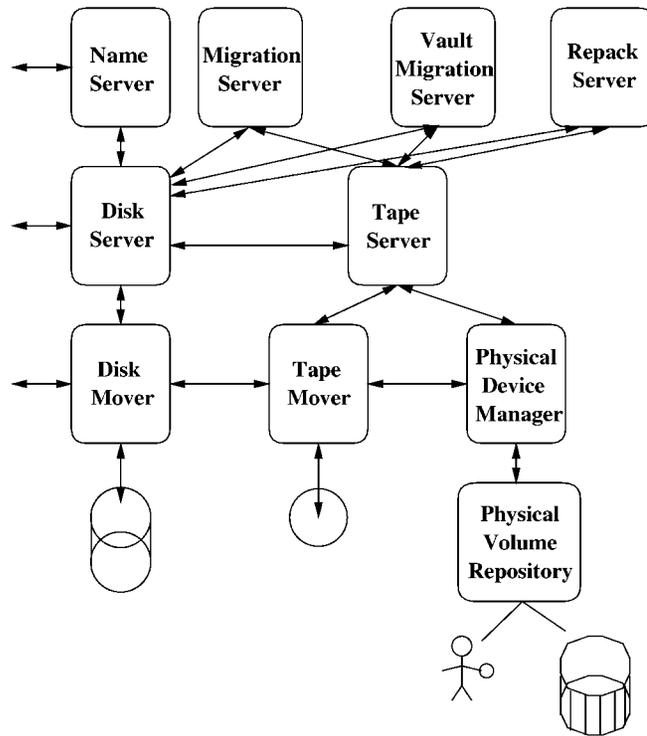
FIG. 15. Static versus dynamic for MVA.

# Data-Intensive Applications



# Analytical Performance Modeling of Hierarchical Mass Storage Systems

Odysseas I. Pentakalos, *Member, IEEE*, Daniel A. Menascé, *Member, IEEE*, Milton Halem, *Member, IEEE*, and Yelena Yesha, *Senior Member, IEEE*

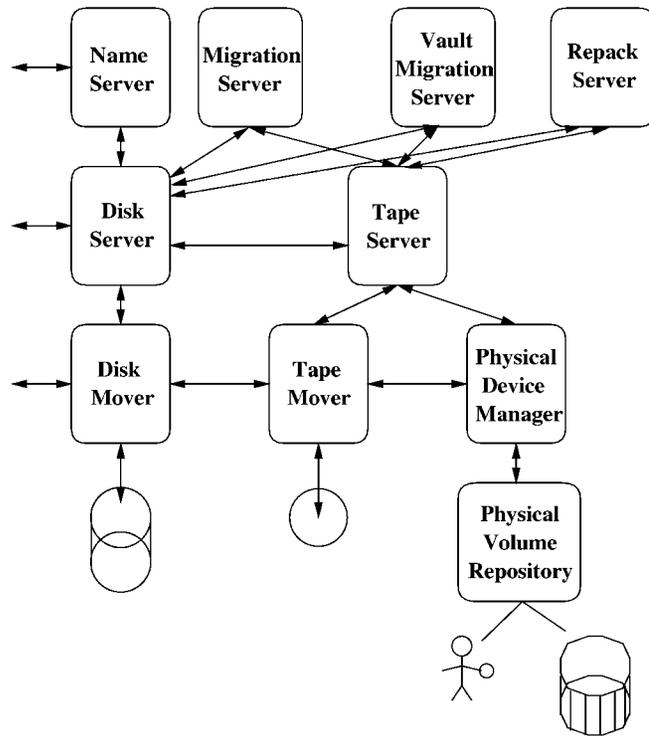


- Thorough workload characterization of NASA Goddard's Space Flight Center workload.

Fig. 1. UCFM system architecture.

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Odysseas I. Pentakalos, *Member, IEEE*, Daniel A. Menascé, *Member, IEEE*, Milton Halem, *Member, IEEE*, and Yelena Yesha, *Senior Member, IEEE*



- Thorough workload characterization of NASA Goddard's Space Flight Center workload.
- Hierarchical combination of RAID disks, robotic tape libraries, human-operated tape systems, and several cache servers.

Fig. 1. UCFM system architecture.

# Analytical Performance Modeling of Hierarchical Mass Storage Systems

Odysseas I. Pentakalos, *Member, IEEE*, Daniel A. Menascé, *Member, IEEE*, Milton Halem, *Member, IEEE*, and Yelena Yesha, *Senior Member, IEEE*

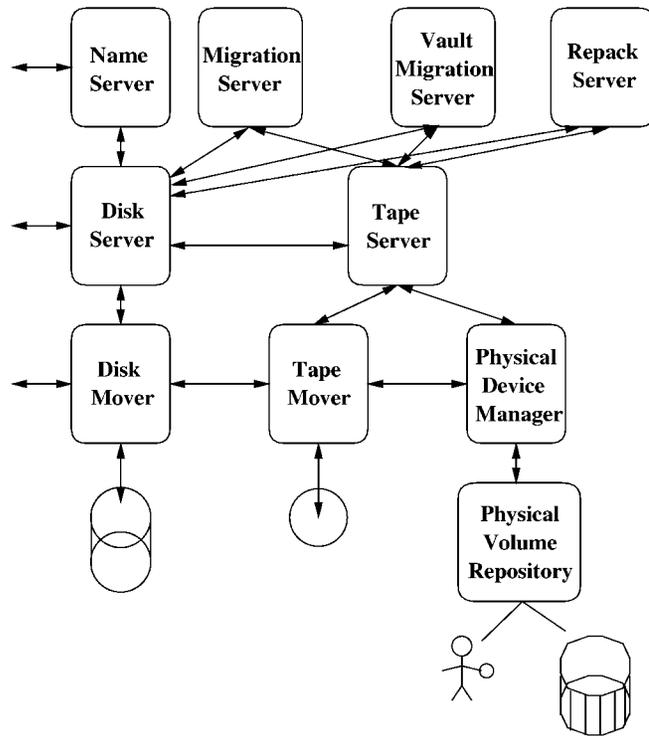


Fig. 1. UCFM system architecture.

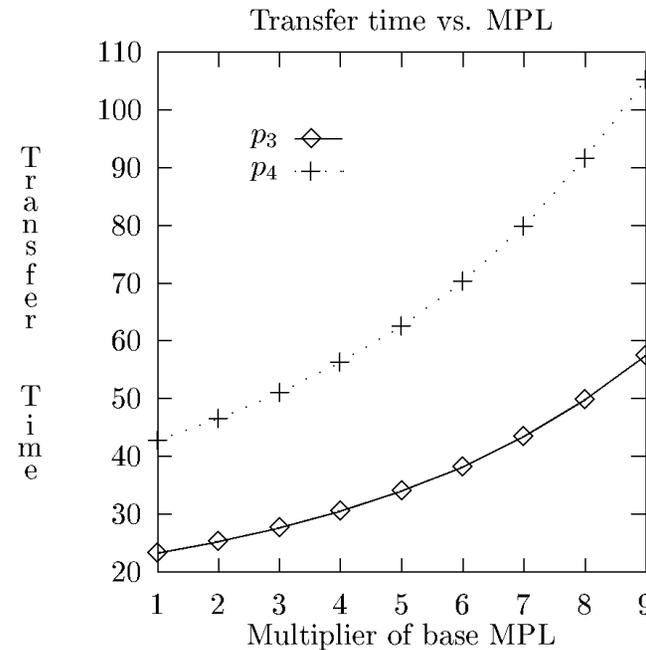


Fig. 7. Transfer time (in seconds) vs. load factor multiplier.

Proc. First IEEE International Conference on Engineering of Complex Computer Systems,  
Southern Florida, USA, November 6--10, 1995 (best paper award)

## A Performance Oriented Design Methodology for Large-Scale Distributed Data Intensive Information Systems

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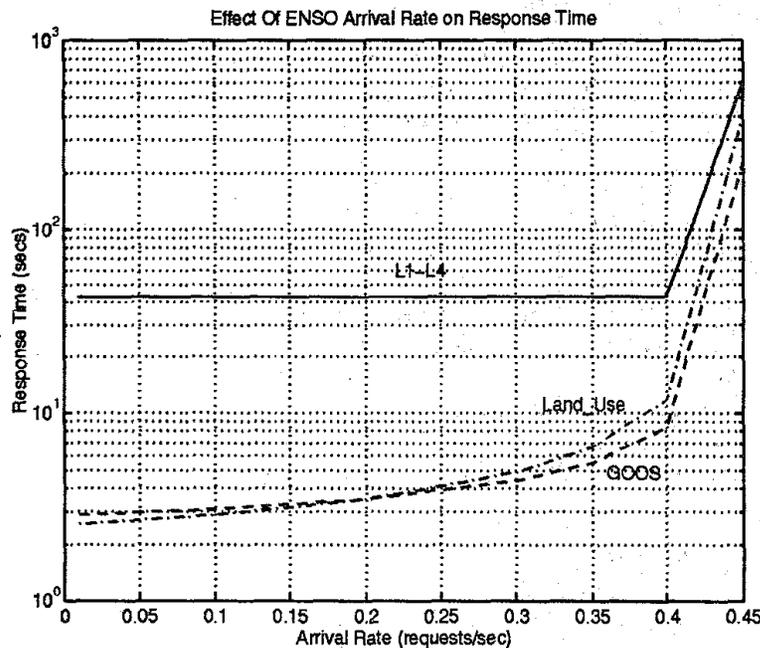


Figure 7: Impact of ENSO arrival rate on GOOS, L1-L4, and Land Use scenarios.

- Performance evaluation of architectures that support NASA's Earth Observing System Distributed Information System.

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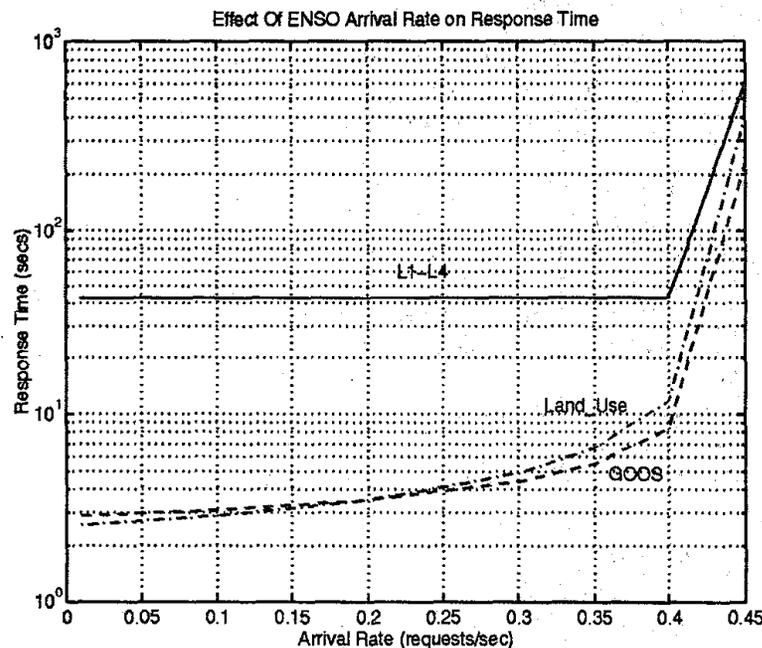


Figure 7: Impact of ENSO arrival rate on GOOS, L1-L4, and Land Use scenarios.

- Performance evaluation of architectures that support NASA's Earth Observing System Distributed Information System.
- High data rate generation (terabytes to petabytes per day)

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## A Performance Oriented Design Methodology for Large-Scale Distributed Data Intensive Information Systems

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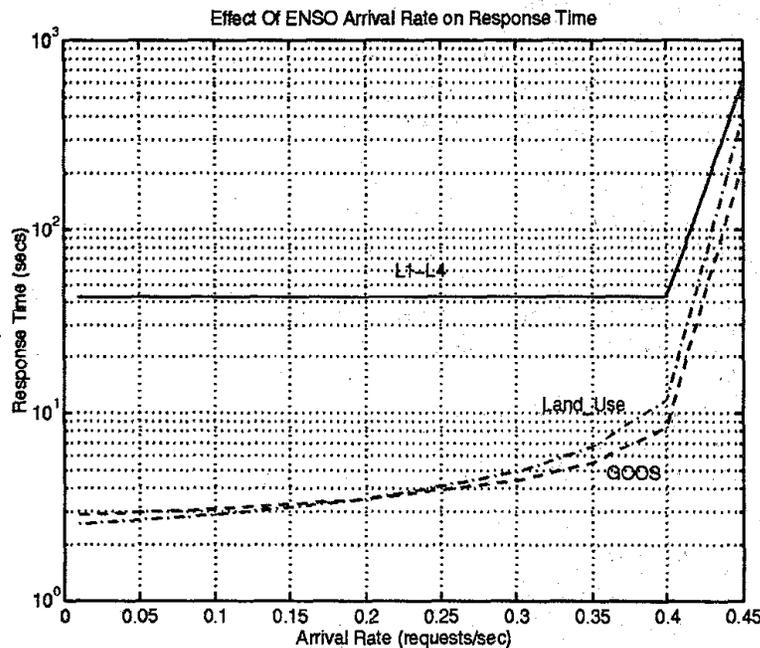


Figure 7: Impact of ENSO arrival rate on GOOS, L1-L4, and Land Use scenarios.

- Performance evaluation of architectures that support NASA's Earth Observing System Distributed Information System.
- High data rate generation (terabytes to petabytes per day)
- Distributed archival and retrieval.

# E-commerce Systems

The screenshot shows the Amazon.com website interface. At the top, the Amazon logo is on the left, and a personalized greeting says "Hello, daniel menasce. We have recommendations for you. (Not daniel?)". Below this are links for "Today's Deals", "Gifts & Wish Lists", and "Gift Cards". The search bar contains the text "menasce" and is set to the "Books" department. Navigation tabs include "Books", "Advanced Search", "Browse Subjects", "New Releases", "Bestsellers", "The New York Times® Bestsellers", "Libros En Español", and "Bargain B".

On the left sidebar, the "Department" is set to "Books", with a list of sub-categories including "Computers & Internet (355)", "Arts & Photography (27)", "Professional & Technical (282)", "Nonfiction (220)", "Teens (3)", "Business & Investing (97)", "Reference (92)", "History (147)", "Literature & Fiction (55)", "Law (10)", "Travel (18)", "Religion & Spirituality (116)", "Health, Mind & Body (40)", "Entertainment (20)", "Science (248)", "Medicine (107)", and "Biographies & Memoirs (49)".

The main content area shows search results for "menasce". A suggestion "Did you mean: [menace](#)" is displayed. Below it, "Showing 1 - 12 of 828 Results" is shown. Two results are visible:

- Performance by Design: Computer Capacity Planning By Example** by Daniel A. Menasce, Lawrence W. Dowdy, and Virgilio A.F. Almeida (**Paperback** - Jan 15, 2004)  
Buy new: ~~\$54.99~~ **\$38.60**  
18 used from ~~\$27.47~~  
Get it by **Wednesday, Nov 11** if you order in the next **21 hours** and choose one-day shipping.  
Eligible for **FREE** Super Saver Shipping.  
★★★★★ (5)
- Capacity Planning for Web Services: Metrics, Models, and Methods** by Daniel A. Menasce and Virgilio A.F. Almeida (**Paperback** - Sep 21, 2001)  
Buy new: ~~\$54.99~~ **\$32.57**  
16 used from ~~\$24.49~~  
Get it by **Wednesday, Nov 11** if you order in the next **21 hours** and choose one-day shipping.  
Eligible for **FREE** Super Saver Shipping.  
★★★★★ (2)

## Business-oriented resource management policies for e-commerce servers<sup>☆</sup>

Daniel A. Menascé<sup>a,\*</sup>, Virgilio A.F. Almeida<sup>b</sup>, Rodrigo Fonseca<sup>b</sup>, Marco A. Mendes<sup>b</sup>

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D.A. Menascé et al. / Performance Evaluation 42 (2000) 223–239

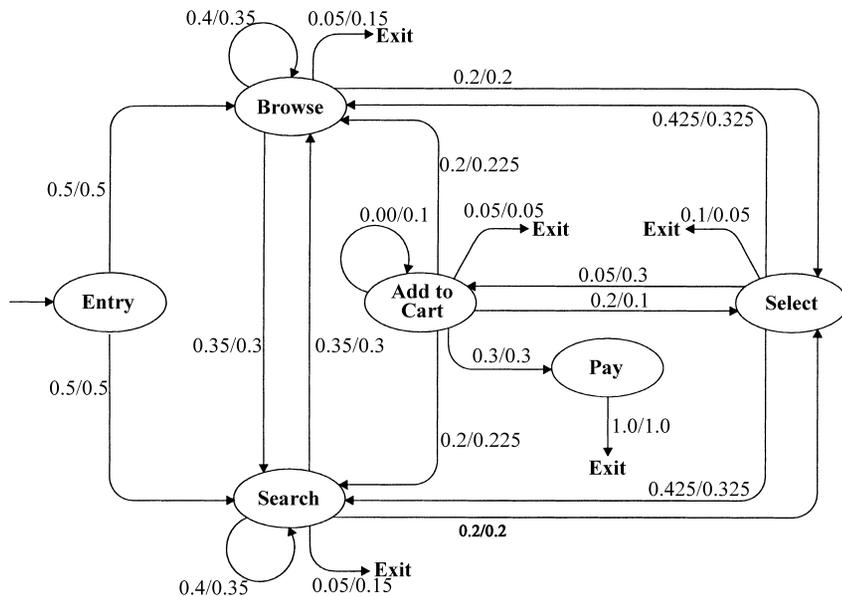


Fig. 1. A CBMG.

- Motivation:
  - provide more resources to customers that are more likely to buy
  - users that have more money in their shopping carts should have higher priority.

## Business-oriented resource management policies for e-commerce servers<sup>☆</sup>

Daniel A. Menascé<sup>a,\*</sup>, Virgilio A.F. Almeida<sup>b</sup>, Rodrigo Fonseca<sup>b</sup>, Marco A. Mendes<sup>b</sup>

<sup>a</sup> Department of Computer Science, MS4A5, George Mason University, Fairfax, VA 22030, USA

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D.A. Menascé et al. / Performance Evaluation 42 (2000) 223–239

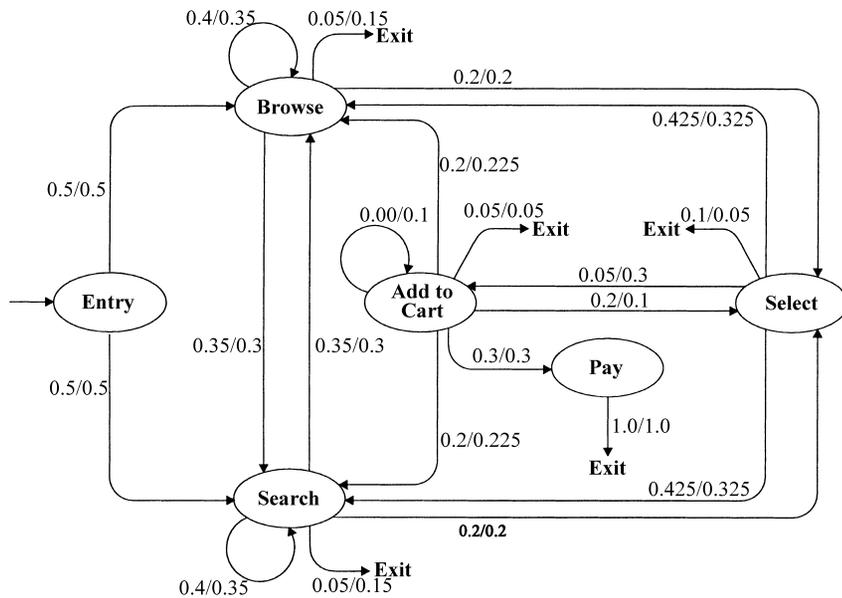


Fig. 1. A CBMG.

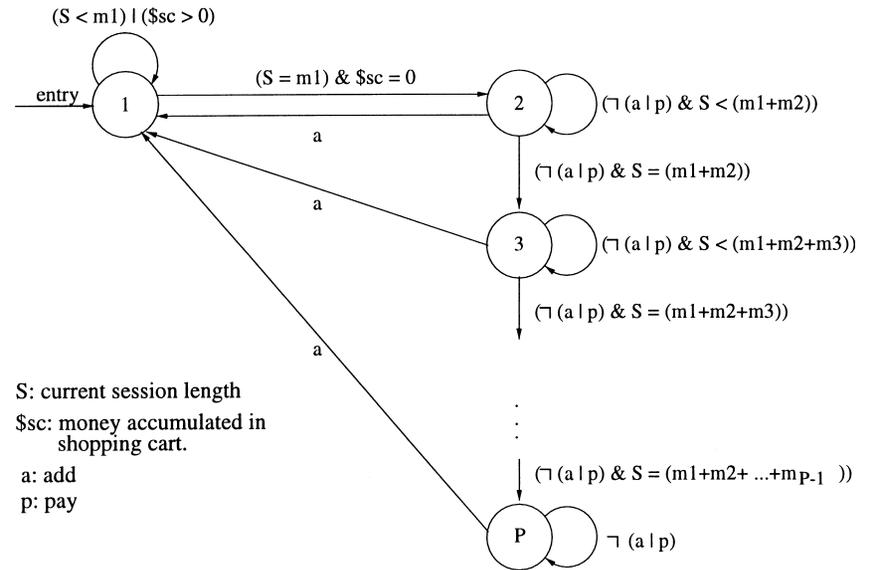


Fig. 3. Multilevel priority scheme for e-commerce sites.



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Performance Evaluation 42 (2000) 223–239

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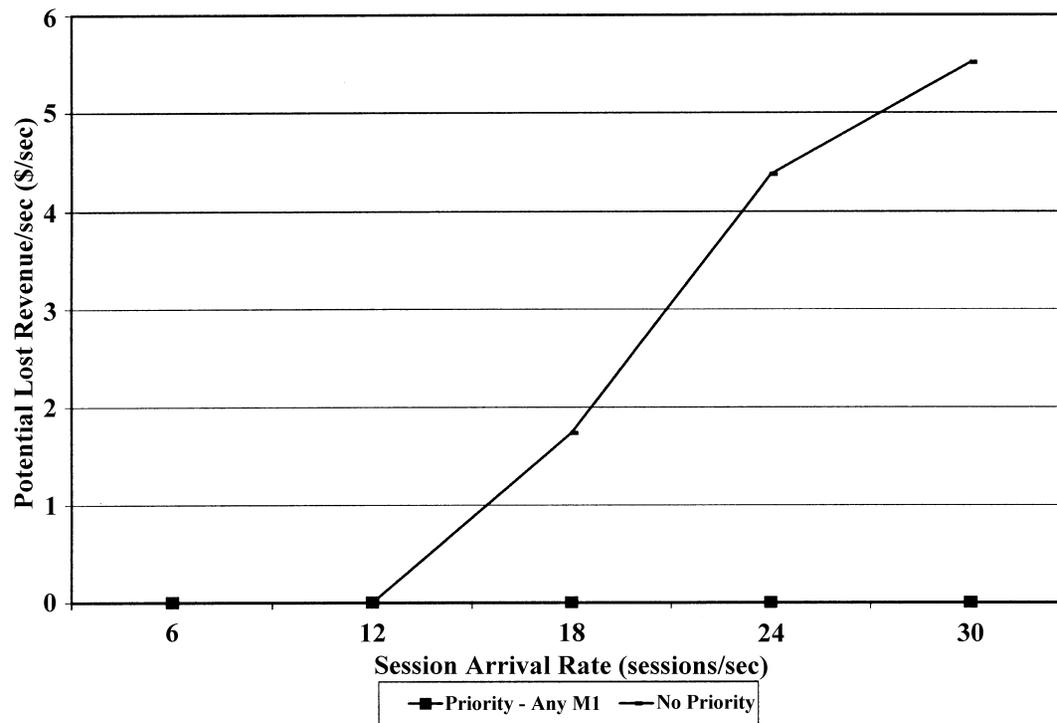
www.elsevier.com/locate/peva

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Daniel A. Menascé<sup>a,\*</sup>, Virgilio A.F. Almeida<sup>b</sup>, Rodrigo Fonseca<sup>b</sup>, Marco A. Mendes<sup>b</sup>

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<sup>b</sup> Department of Computer Science, University of Federal de Minas Gerais, Belo Horizonte, MG 30161, Brazil



- The priority scheme keeps the potential lost revenue close to zero as the session arrival rate increases.

Fig. 7. Potential lost revenue per second vs. session arrival rate.





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Performance Evaluation 54 (2003) 33–57

**PERFORMANCE  
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## A hierarchical and multiscale approach to analyze E-business workloads<sup>☆</sup>

D.A. Menascé<sup>a,\*</sup>, V.A.F. Almeida<sup>b</sup>, R. Riedi<sup>c</sup>, F. Ribeiro<sup>b</sup>,  
R. Fonseca<sup>b</sup>, W. Meira Jr.<sup>b</sup>

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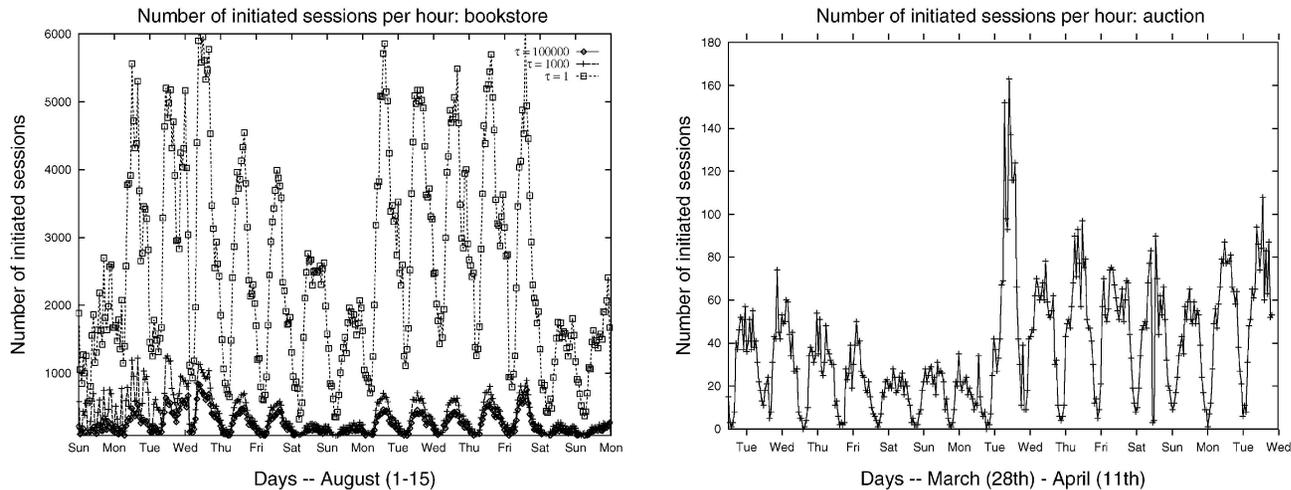


Fig. 17. Number of initiated sessions per hour for the bookstore and the auction site.

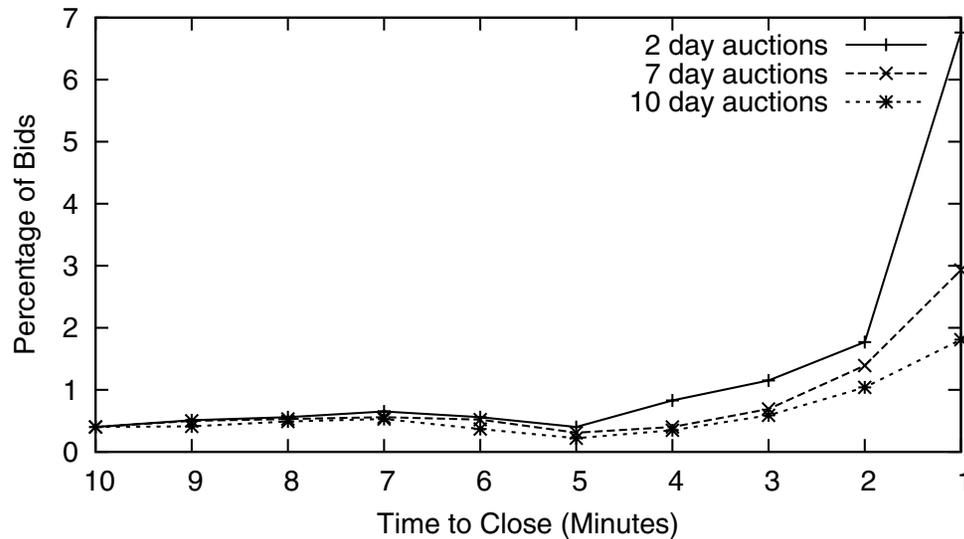


## Two-level workload characterization of online auctions

Vasudeva Akula<sup>a</sup>, Daniel A. Menascé<sup>b,\*</sup>

<sup>a</sup> *The Volgenau School of Information Technology and Engineering, George Mason University, Fairfax, VA 22033, USA*

<sup>b</sup> *Department of Computer Science, George Mason University, Fairfax, VA 22033, USA*



- Most bids come near the closing time of an auction creating huge load spikes.

Fig. 18. Percentage of bids during closing minutes.



## Two-level workload characterization of online auctions

Vasudeva Akula<sup>a</sup>, Daniel A. Menascé<sup>b,\*</sup>

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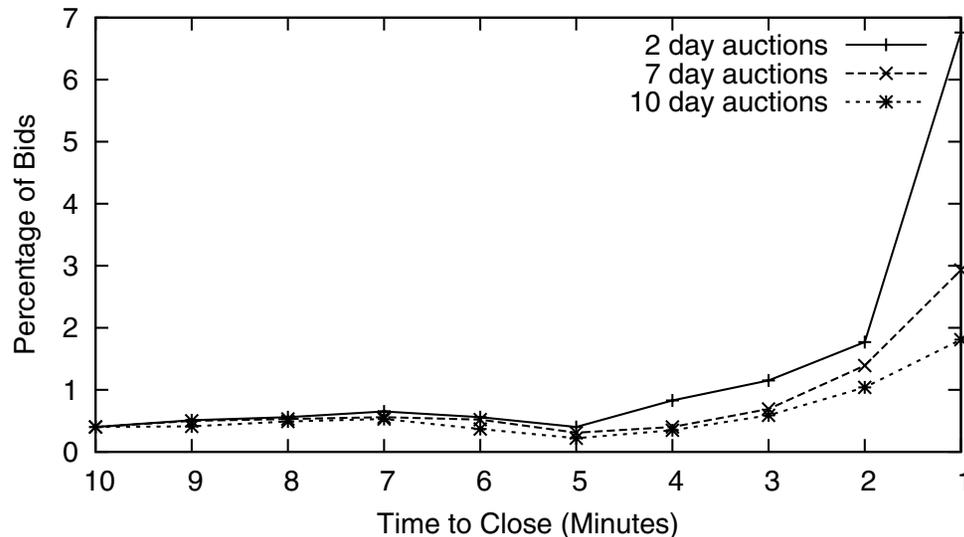
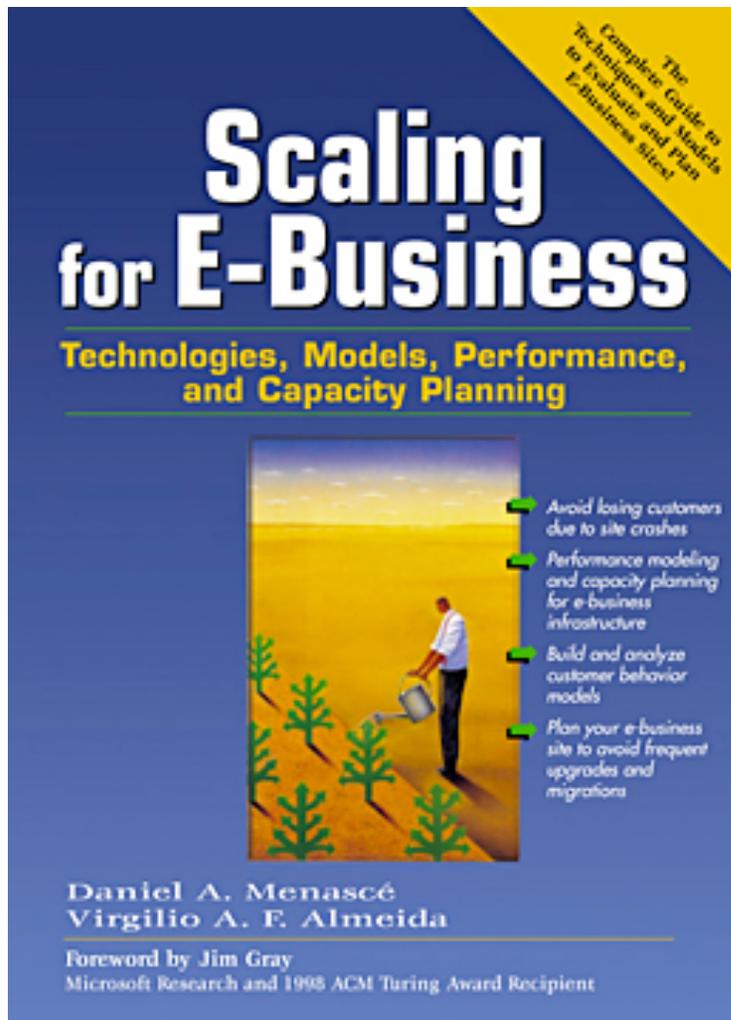


Fig. 18. Percentage of bids during closing minutes.

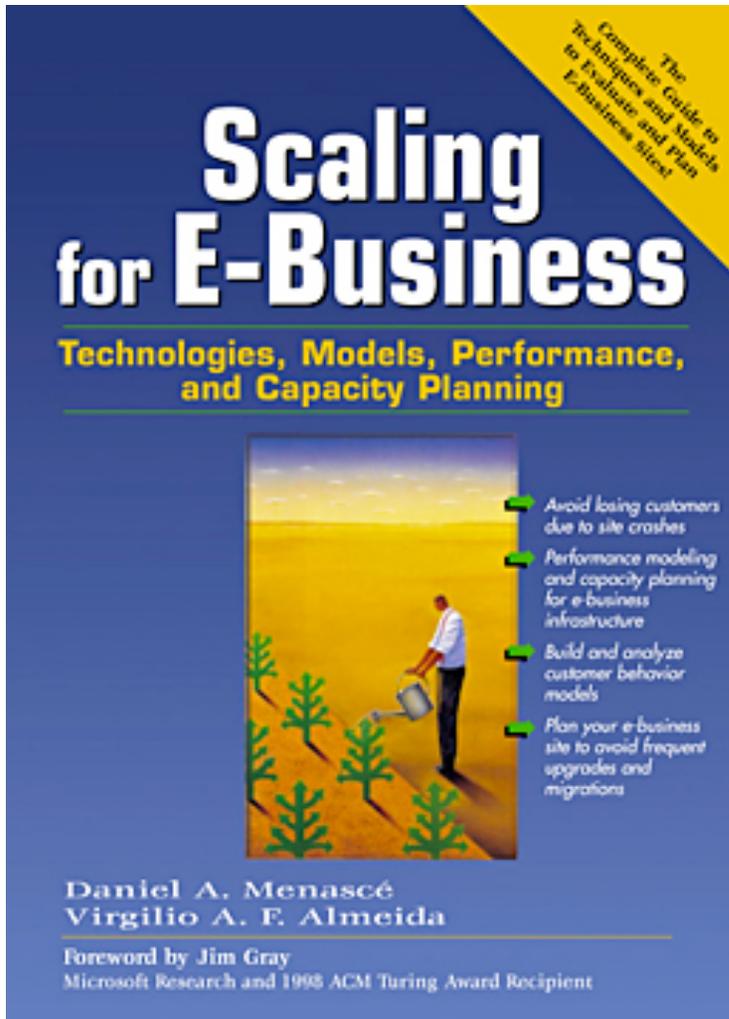
- Most bids come near the closing time of an auction creating huge load spikes.
- Closing time rescheduling mechanisms were devised to smooth the load on auction sites.



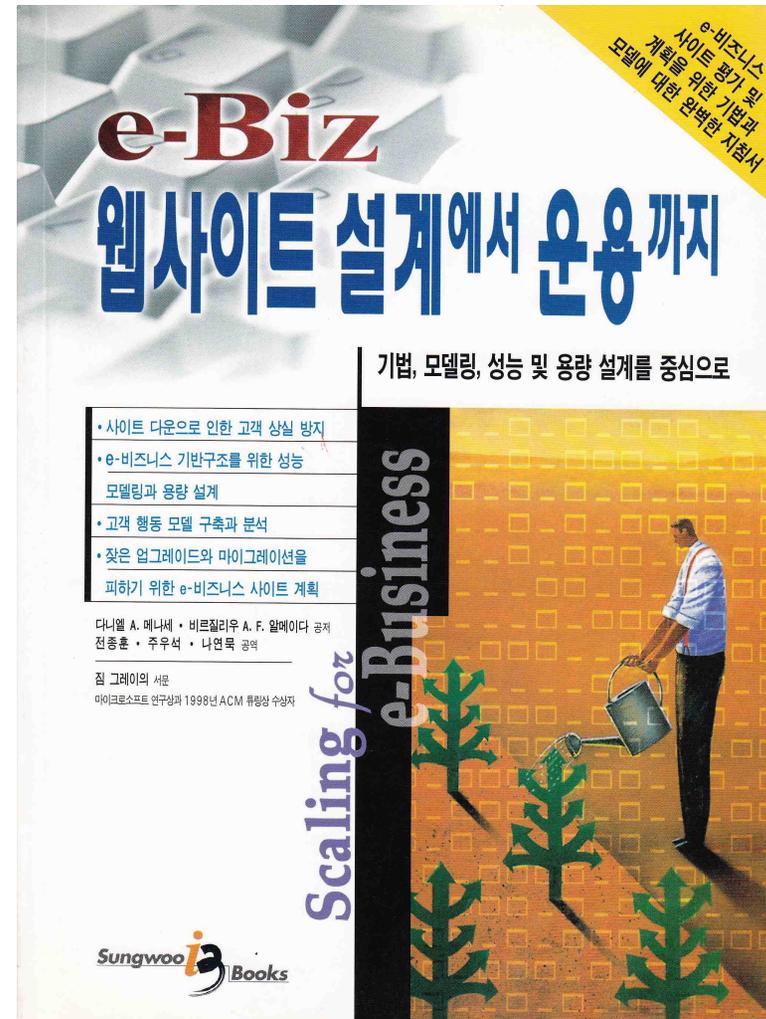
Original Version  
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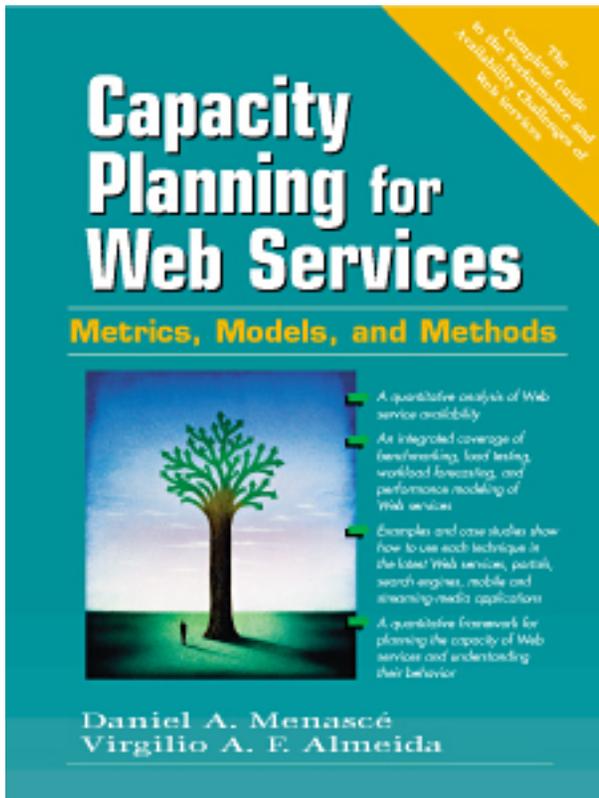




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Prentice Hall, 2000



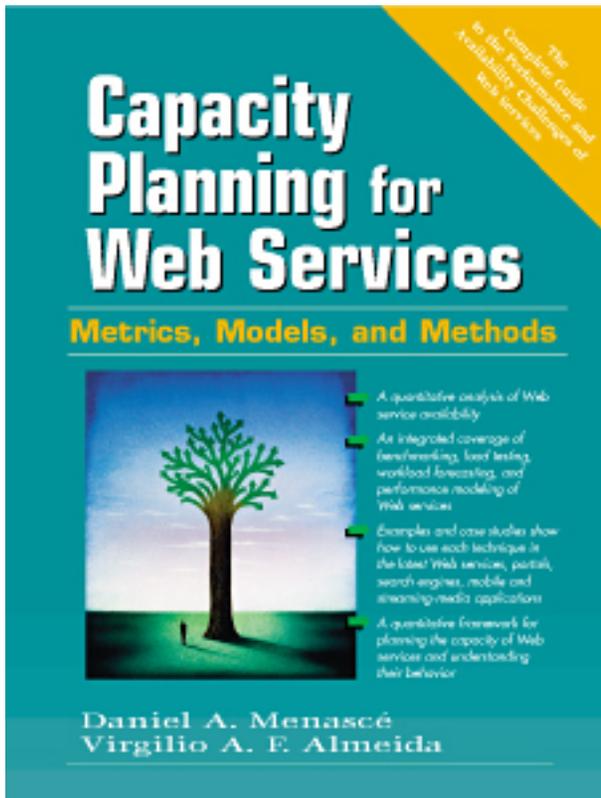
Korean Translation



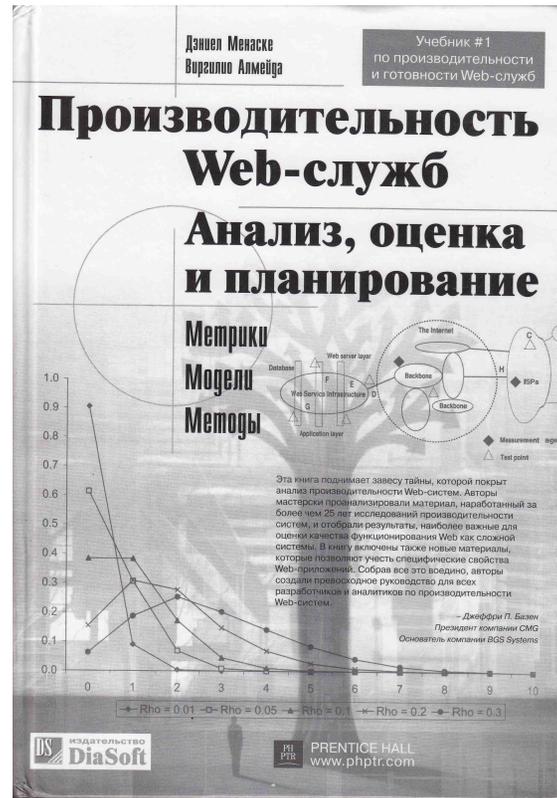
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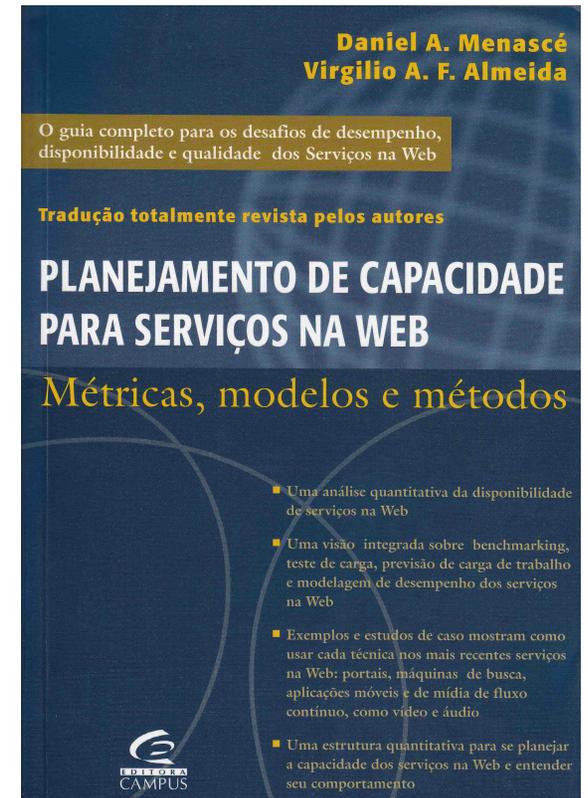




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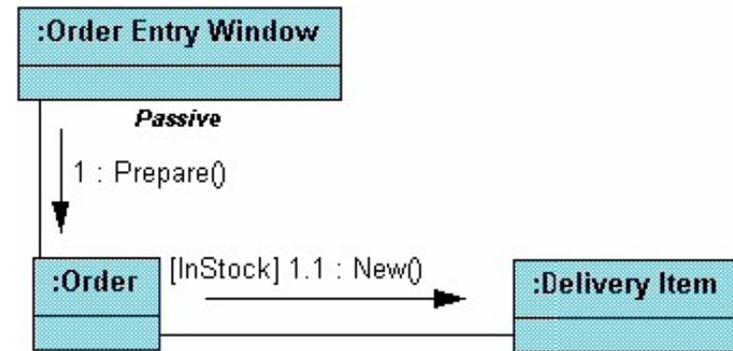
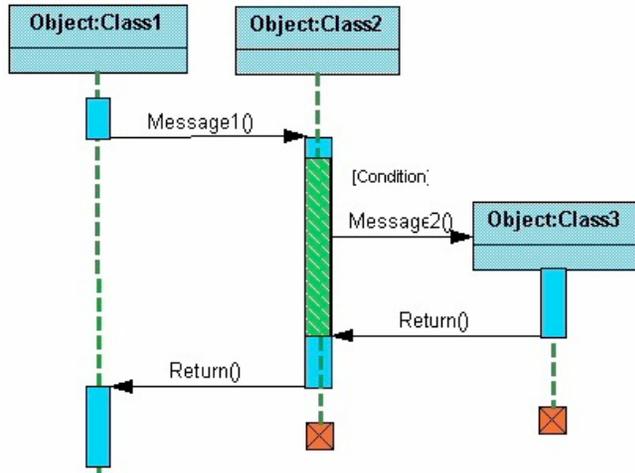


Russian Translation



Portuguese Translation

# Software Performance Engineering



## Software, Performance, or Engineering?

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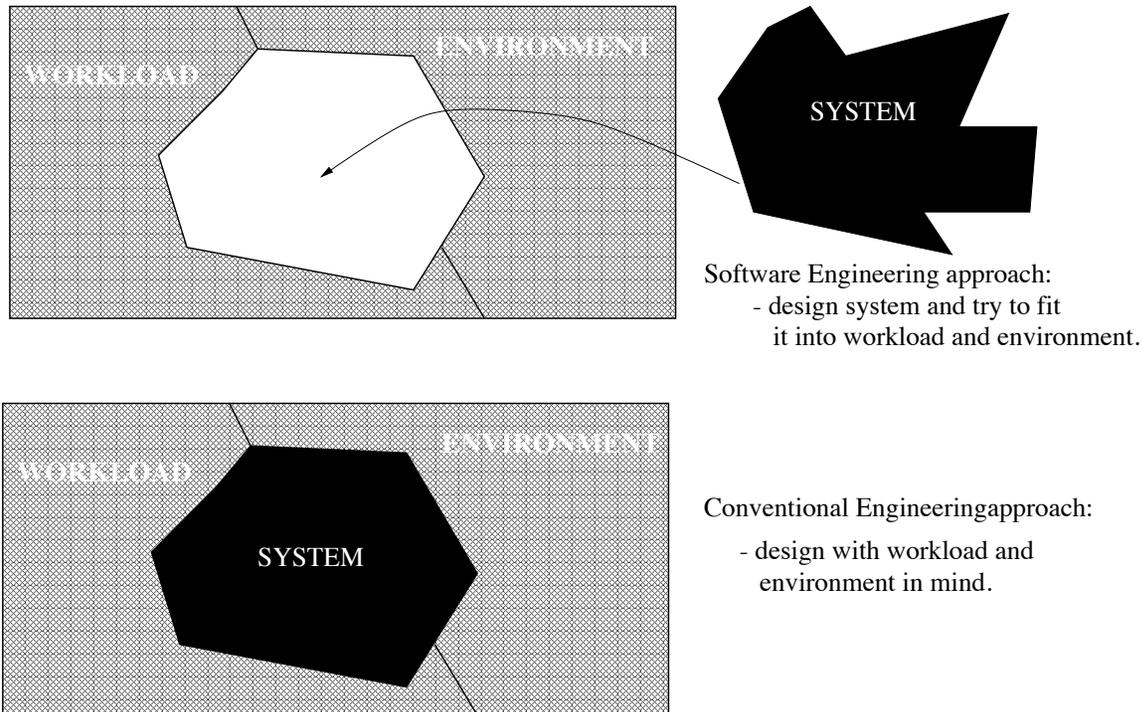
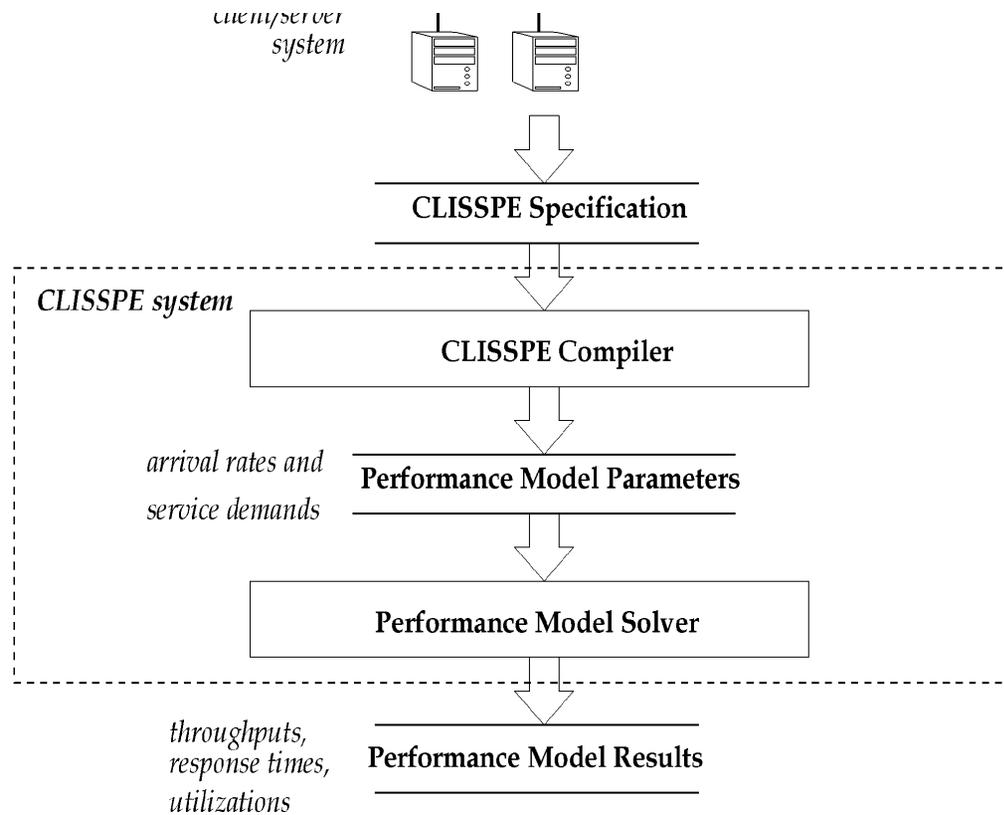


Figure 1: Conventional engineering approach vs. software engineering approach.

# A Method for Design and Performance Modeling of Client/Server Systems

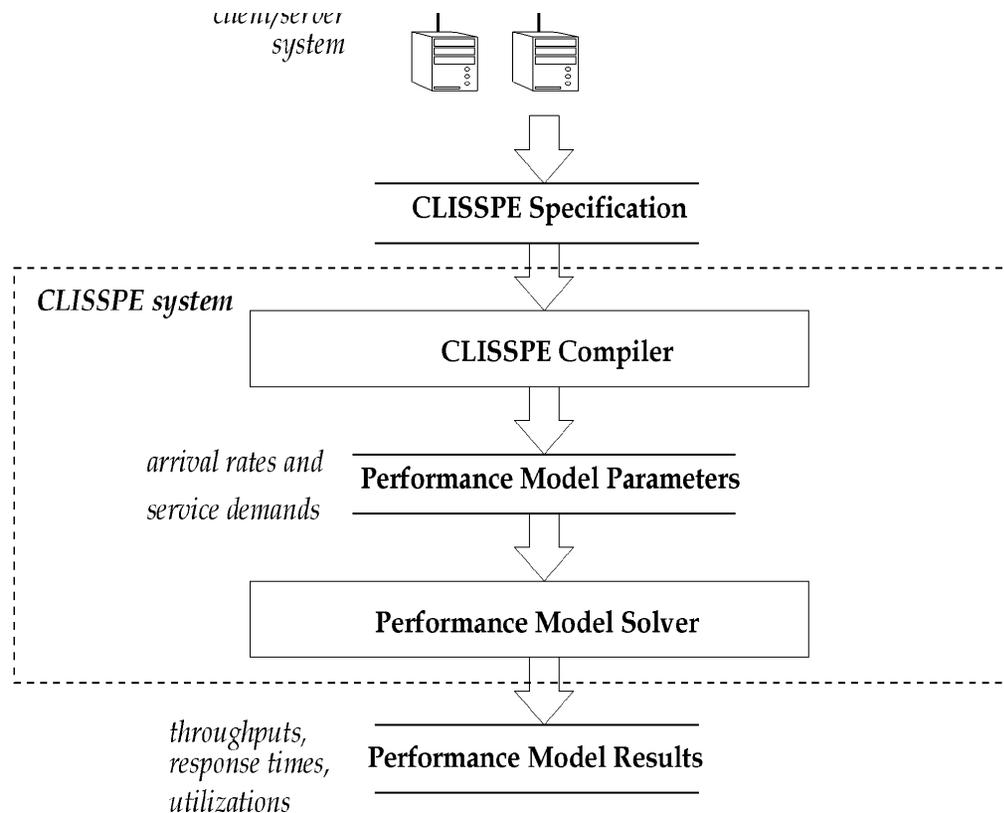
Daniel A. Menascé, *Member, IEEE Computer Society*, and  
Hassan Gomaa, *Member, IEEE Computer Society*



- A language that can be used for specifying the software logic as well as QoS annotations.

# A Method for Design and Performance Modeling of Client/Server Systems

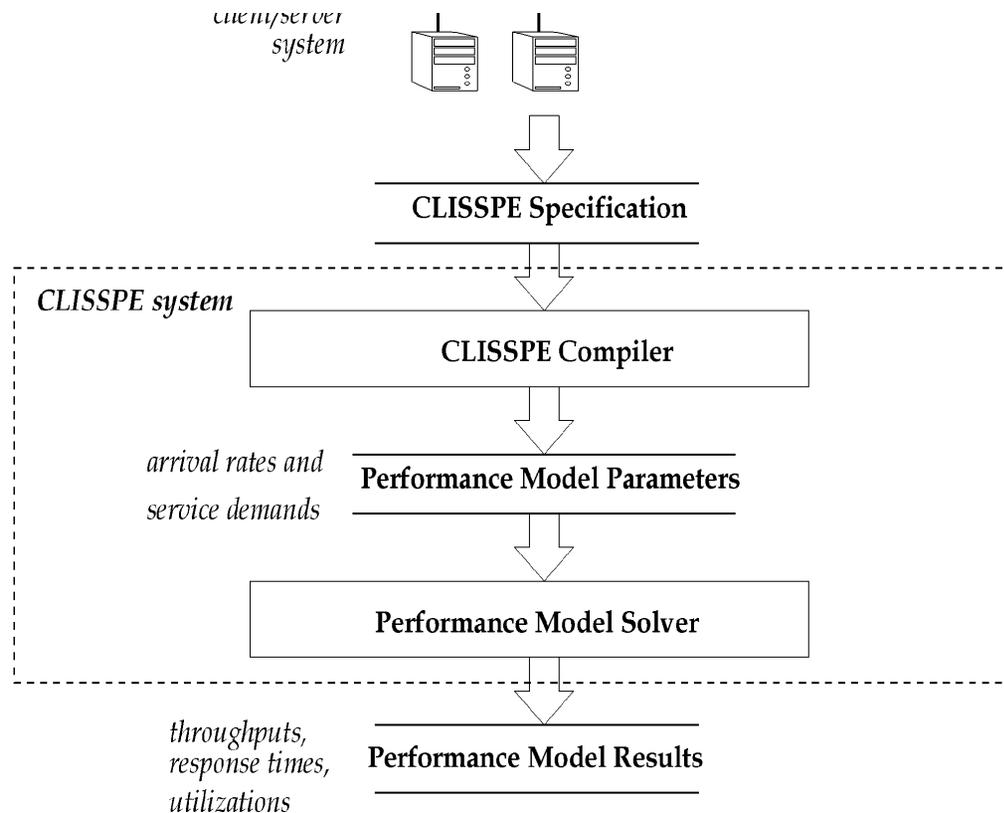
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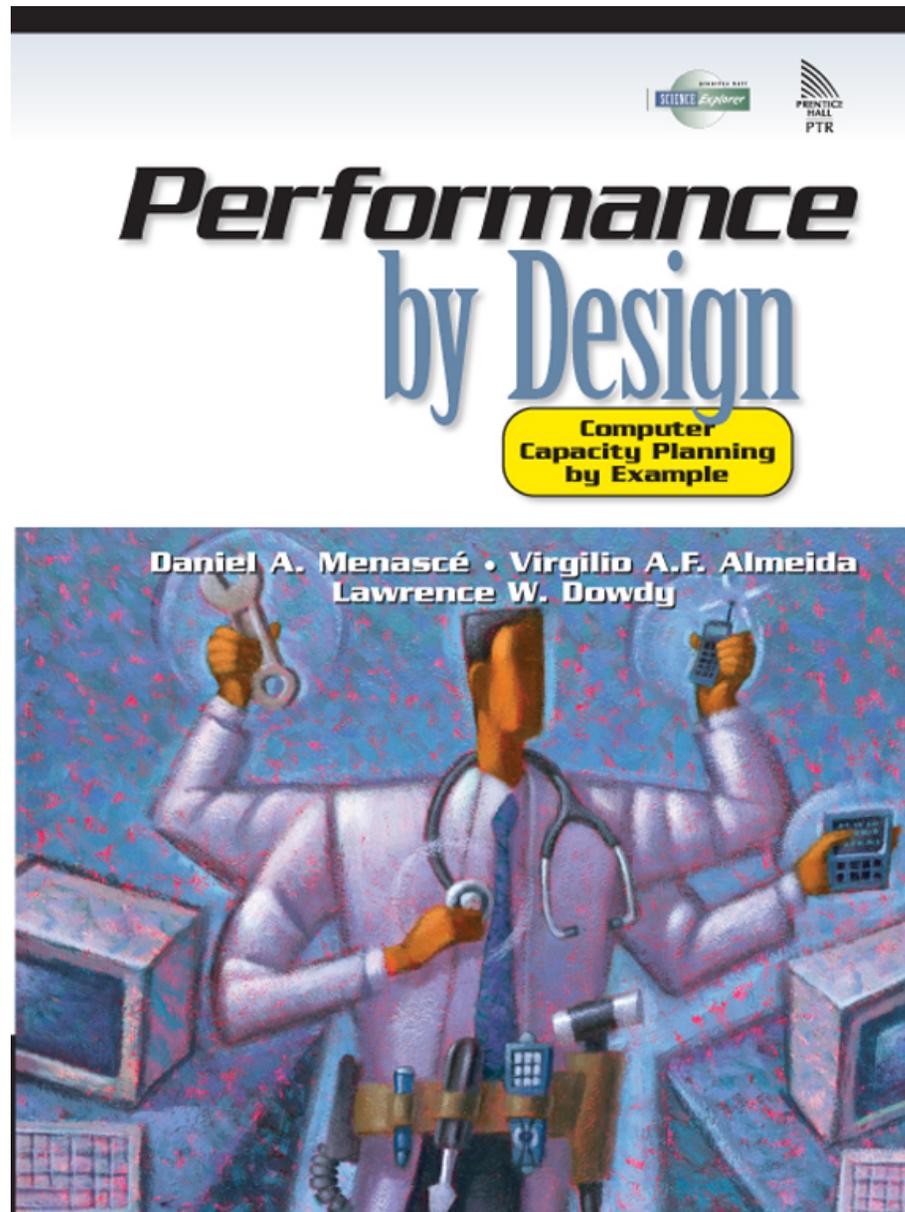
- A language that can be used for specifying the software logic as well as QoS annotations.
- A compiler for the language generates a Queuing Network model and solves it.

# A Method for Design and Performance Modeling of Client/Server Systems

Daniel A. Menascé, *Member, IEEE Computer Society*, and  
Hassan Gomaa, *Member, IEEE Computer Society*



- A language that can be used for specifying the software logic as well as QoS annotations.
- A compiler for the language generates a Queuing Network model and solves it.
- **Bottlenecks in the application are identified.**



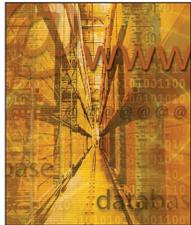
Prentice Hall, 2004.



# Security



## Scaling the Web



# Security Performance

Daniel A. Menascé • George Mason University • menasce@cs.gmu.edu

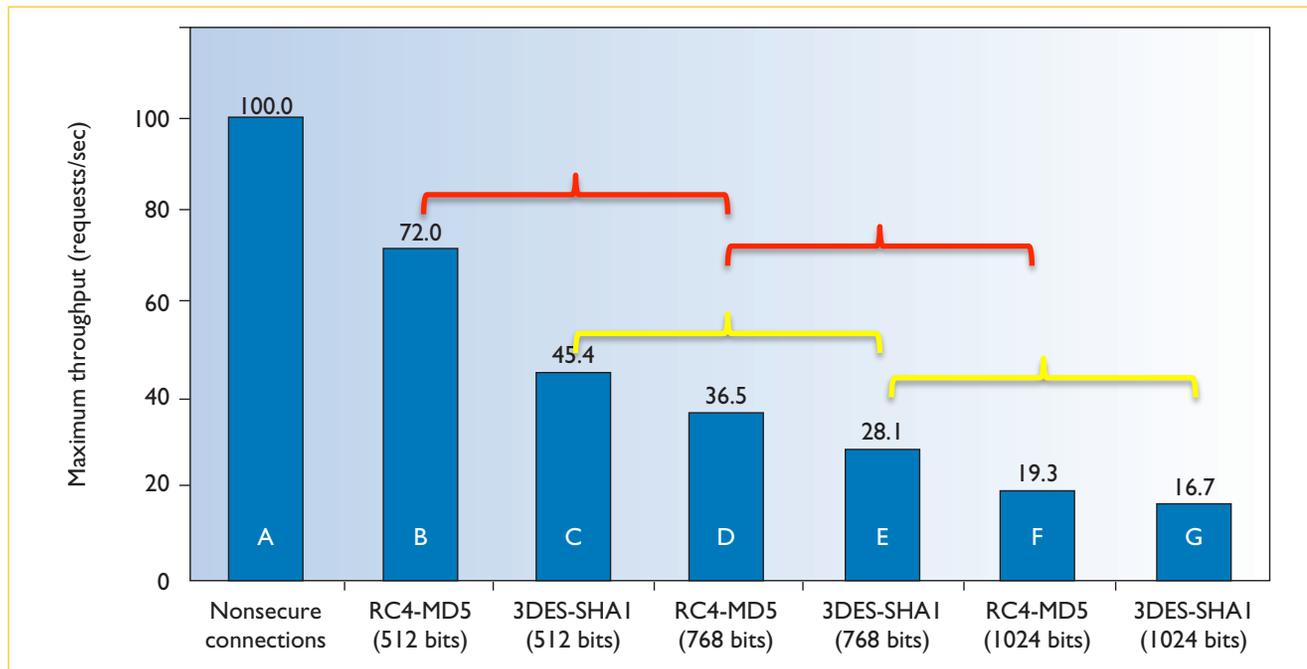


Figure 3. Maximum throughput of Secure Socket Layer for various combinations of cryptographic algorithms and key lengths. For the scenarios in this figure, we use two symmetric key algorithms (RC4 and 3DES), two hash functions (MD5 and SHA-1), and three key lengths (512, 768, and 1,024 bits) for the public key operations.

## A Methodology for Analyzing the Performance of Authentication Protocols

ALAN HARBITTER  
 PEC Solutions, Inc.  
 and  
 DANIEL A. MENASCÉ  
 George Mason University

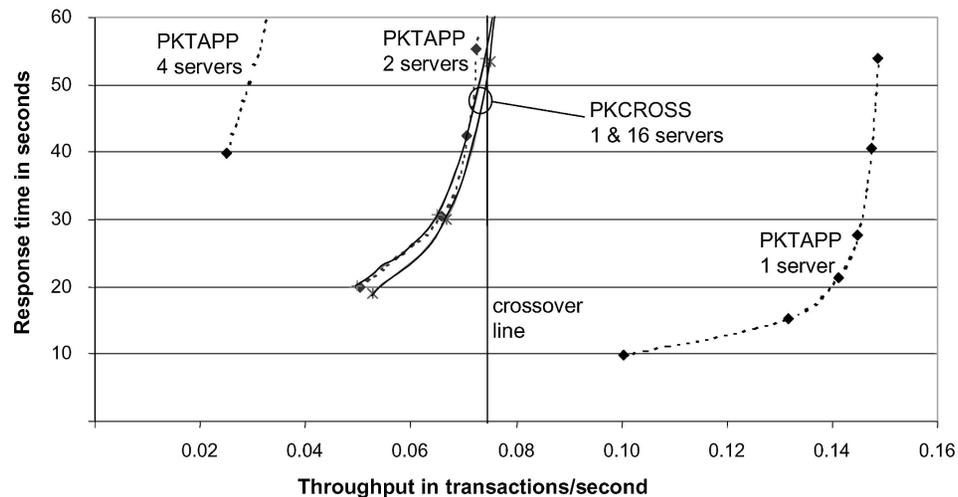


Fig. 5. Comparative PKCROSS and PKTAPP performance.

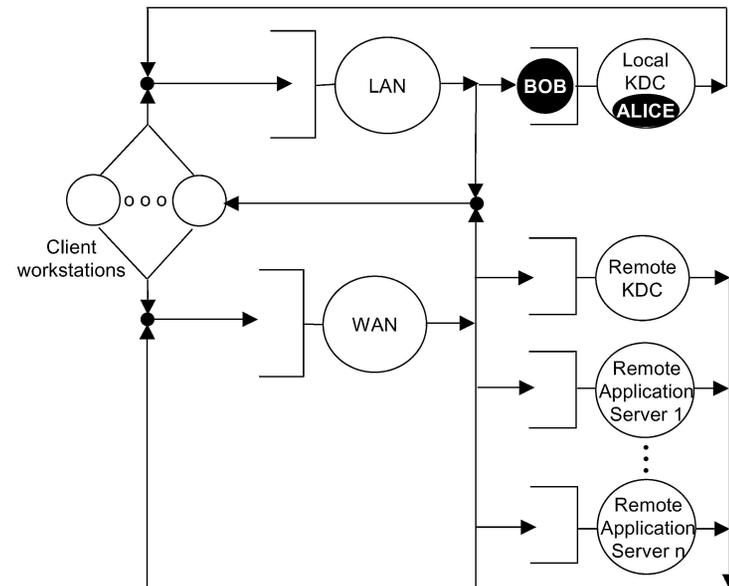
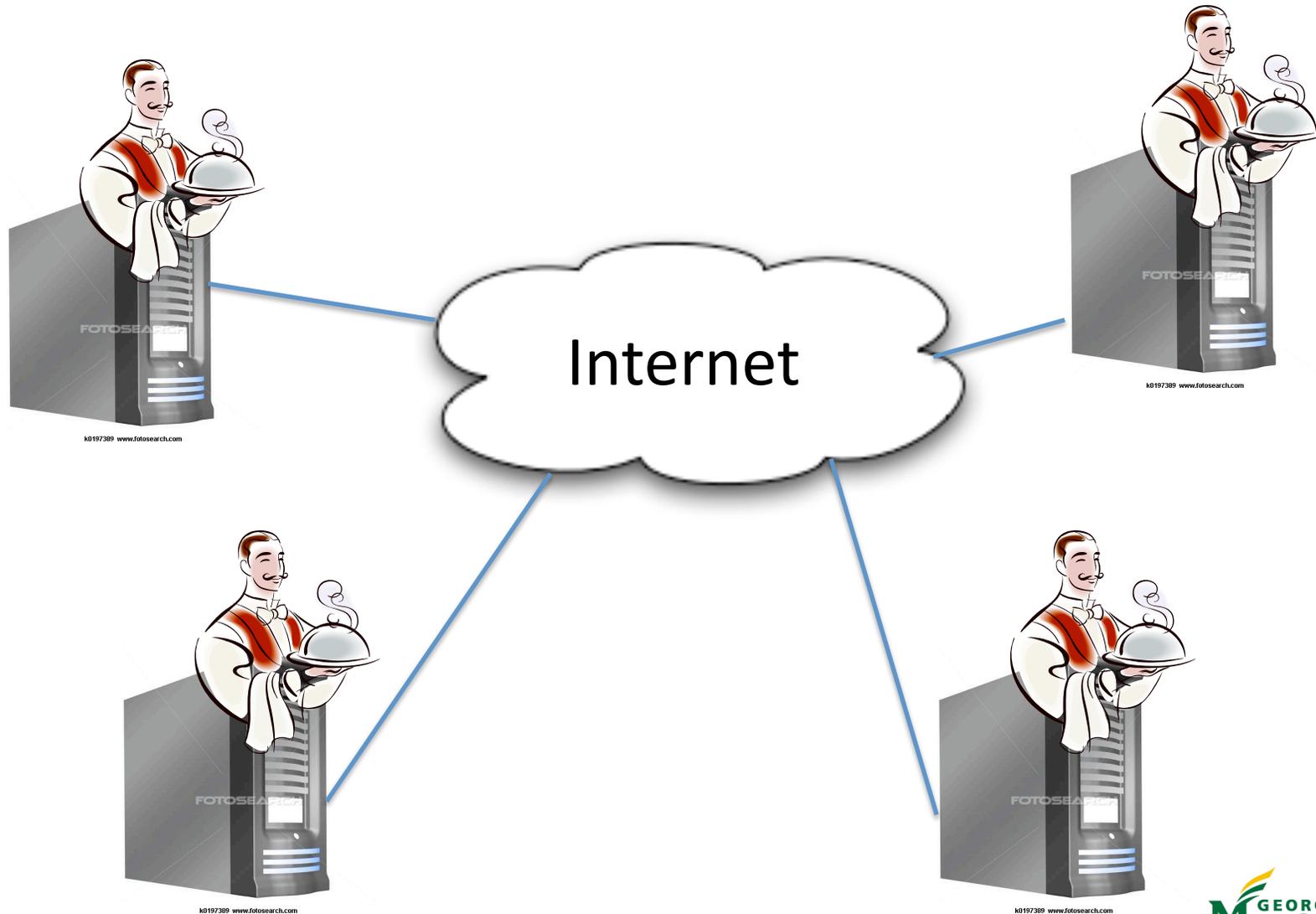


Fig. 1. Modeling topology for a multiple-realm authentication.

- Analytic models to analyze adding Public-Key cryptography into Kerberos.

# Service-Oriented Architectures



## QoS management in service-oriented architectures

Daniel A. Menascé<sup>a,\*</sup>, Honglei Ruan<sup>a</sup>, Hassan Gomaa<sup>b</sup>

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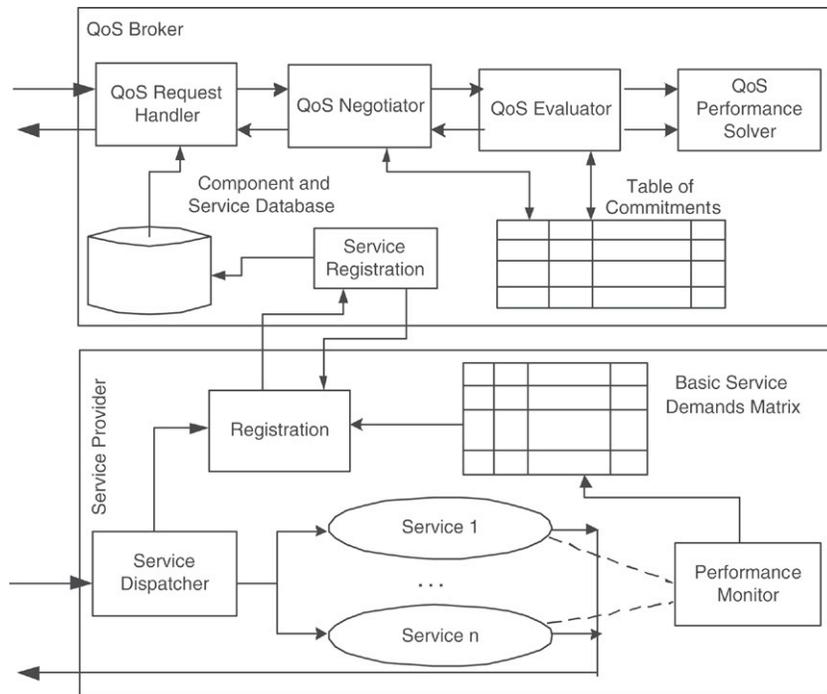
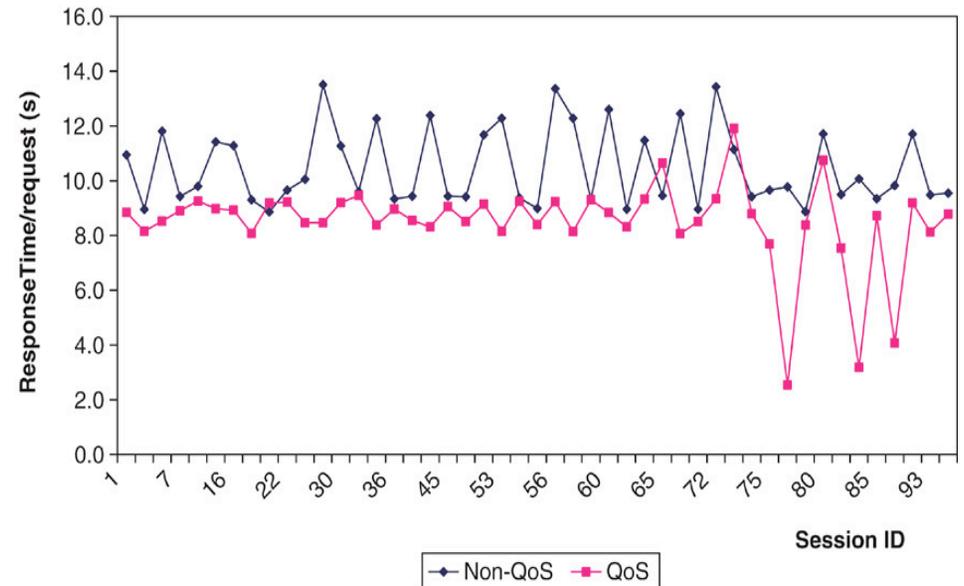


Fig. 2. Architecture of a QoS broker and a SP.



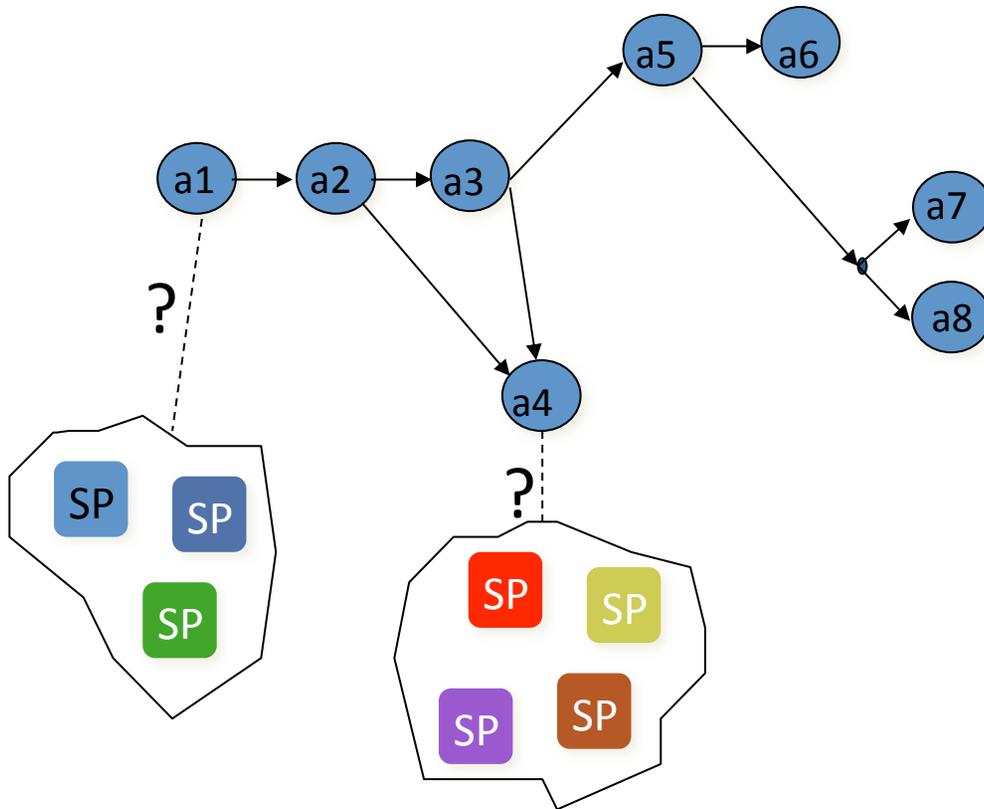
## On optimal service selection in Service Oriented Architectures

Daniel A. Menascé<sup>a,\*</sup>, Emiliano Casalicchio<sup>b</sup>, Vinod Dubey<sup>c</sup>

<sup>a</sup> Department of Computer Science, MS 5C8, George Mason University, Fairfax, VA 22030, USA

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## On optimal service selection in Service Oriented Architectures

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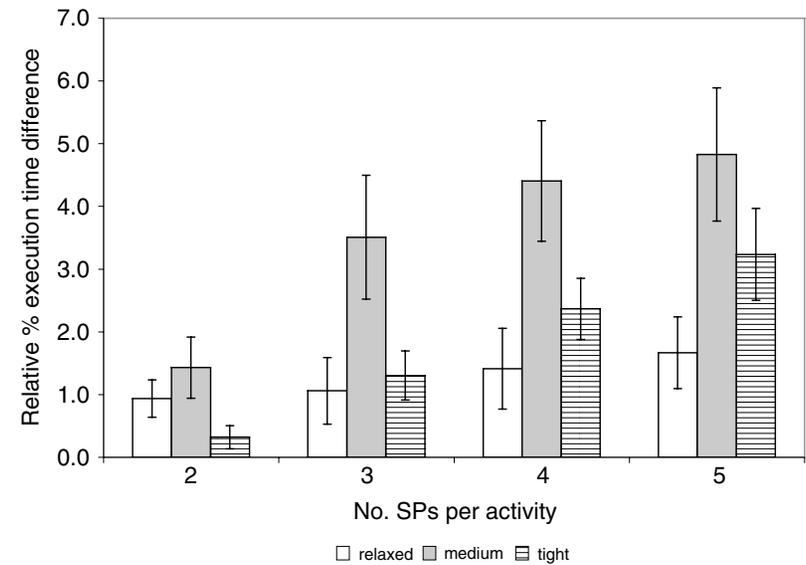
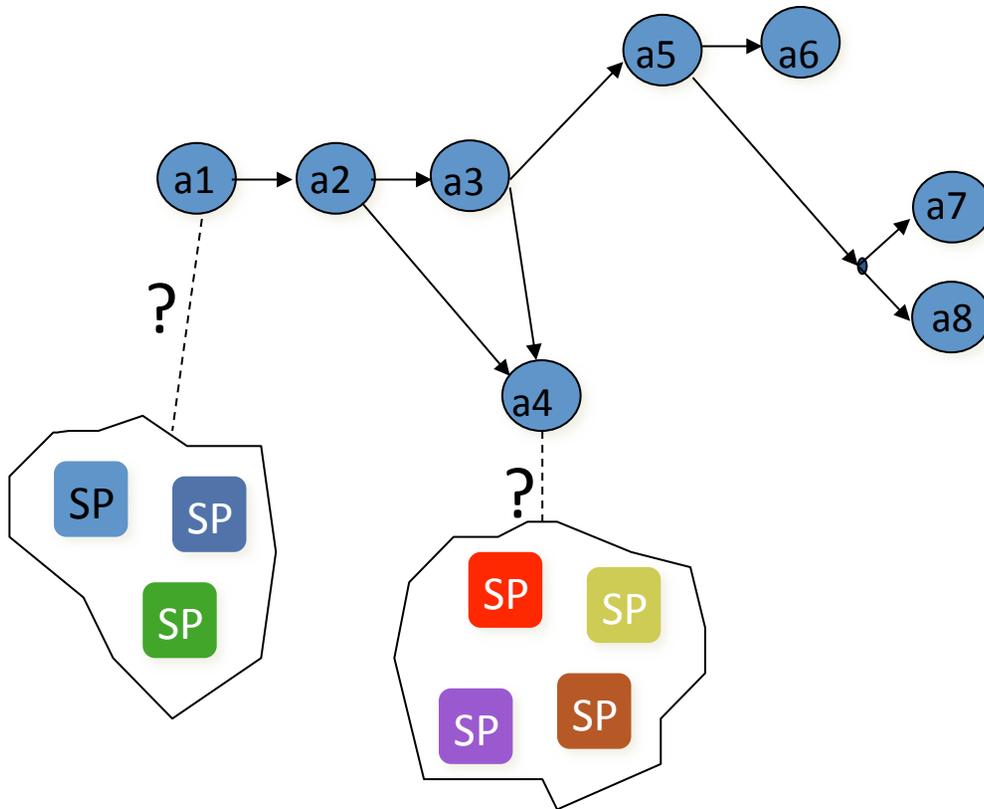
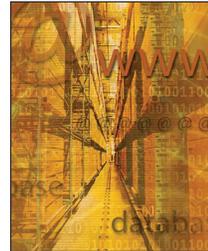


Fig. 5. Average value of  $\epsilon_R$  vs.  $n_{spa}$  for the three values of the constraint tightness.

# QoS Models in Grid Computing and Cloud Computing

Scaling the Web

## QoS in Grid Computing



IEEE Internet Computing, July 2004

Daniel A. Menascé • *George Mason University*  
Emiliano Casalicchio • *University of Rome "Tor Vergata"*

## A Framework for Resource Allocation in Grid Computing

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IEEE MASCOTS Conf., 2004

## Understanding Cloud Computing: Experimentation and Capacity Planning

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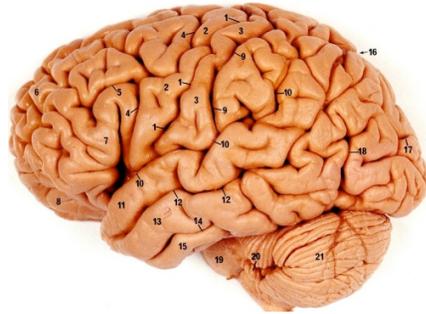
CMG Conf., 2009



Part II

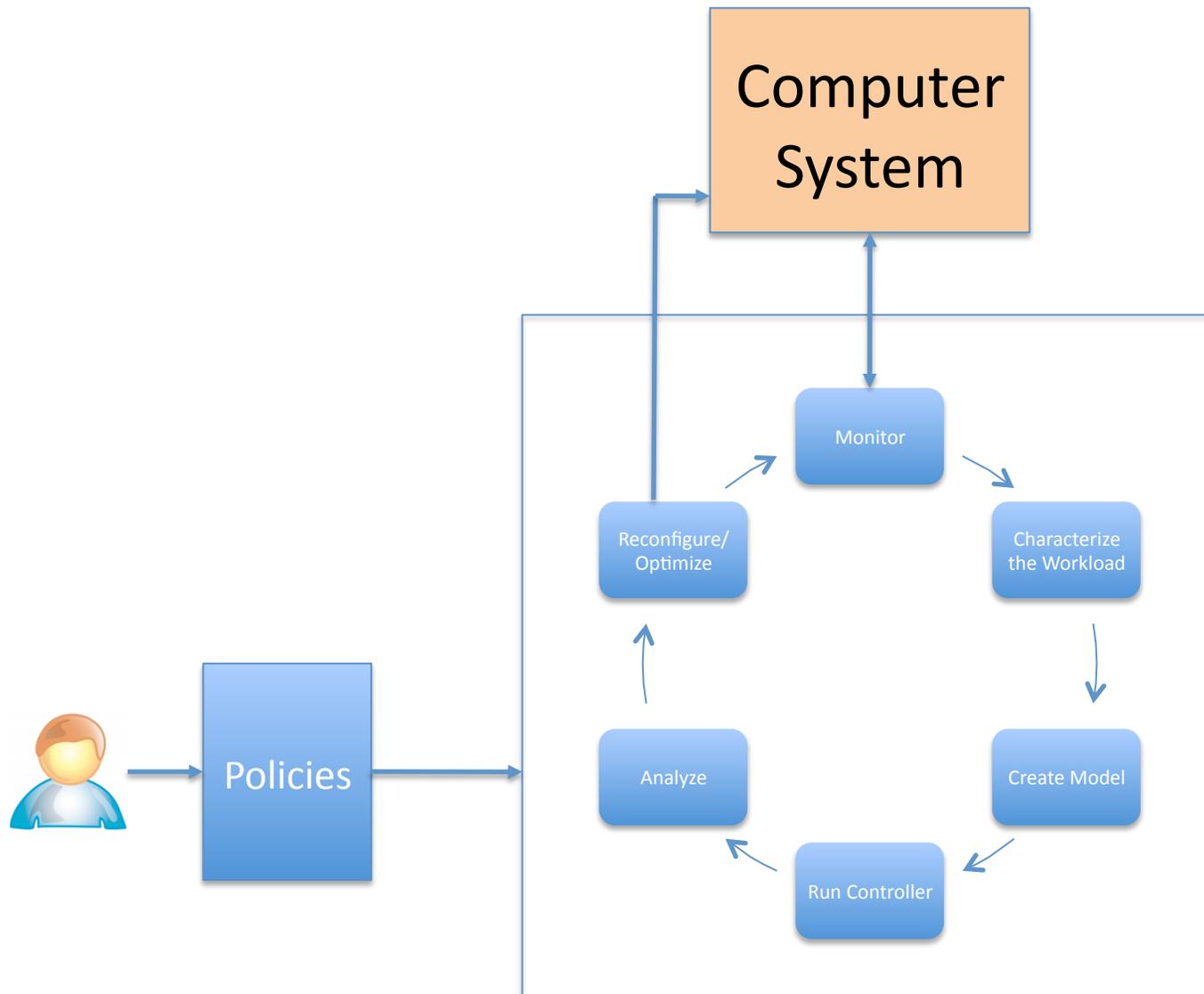
# COMPUTERS CREATE AND USE MODELS OF COMPUTER SYSTEMS

# Autonomic Computing (or Self-\* Systems)



- Self-optimizing
- Self-configuring
- Self-protecting
- Self-healing

# Modeling in Autonomic Computing Systems



*Autonomic Controller*

ACM Conference on E-Commerce, 2001.

## Preserving QoS of E-commerce Sites Through Self-Tuning: A Performance Model Approach

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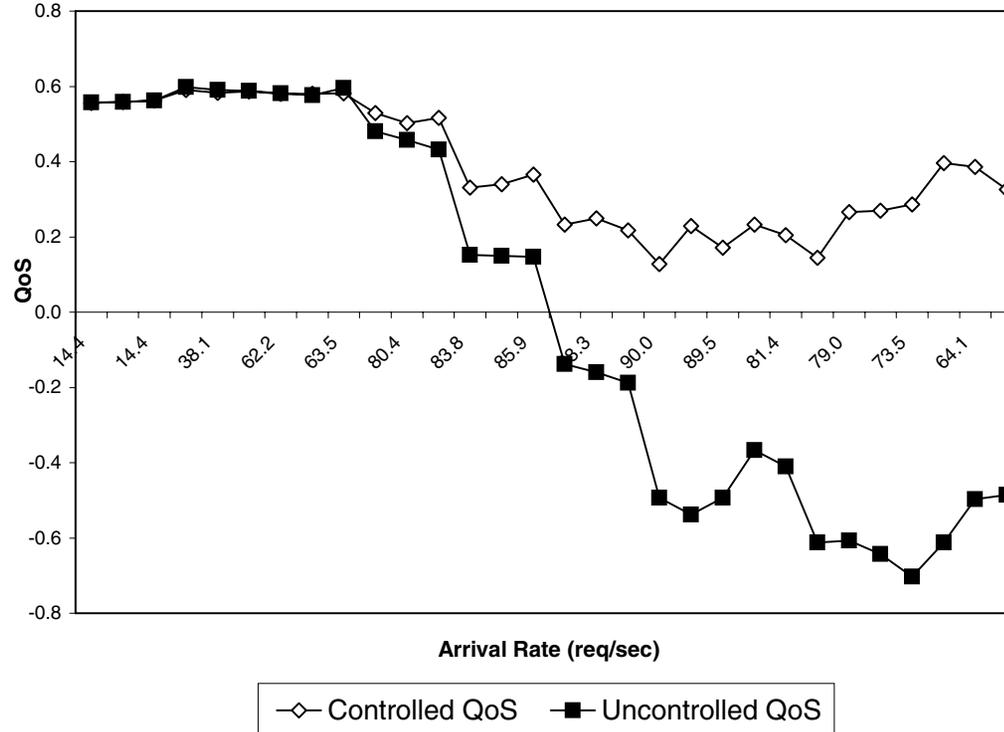
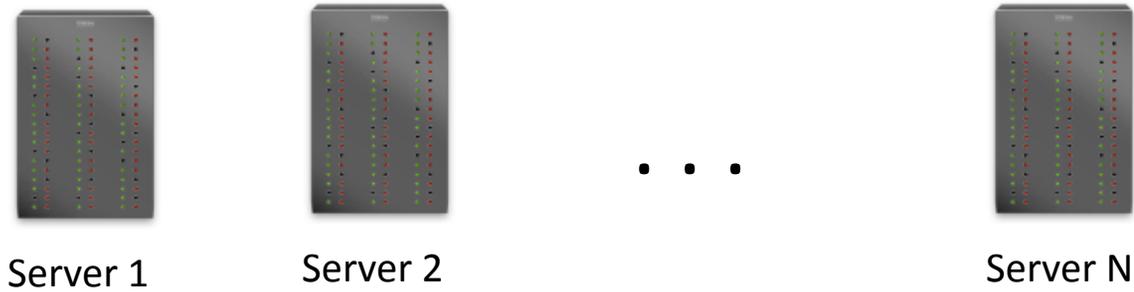
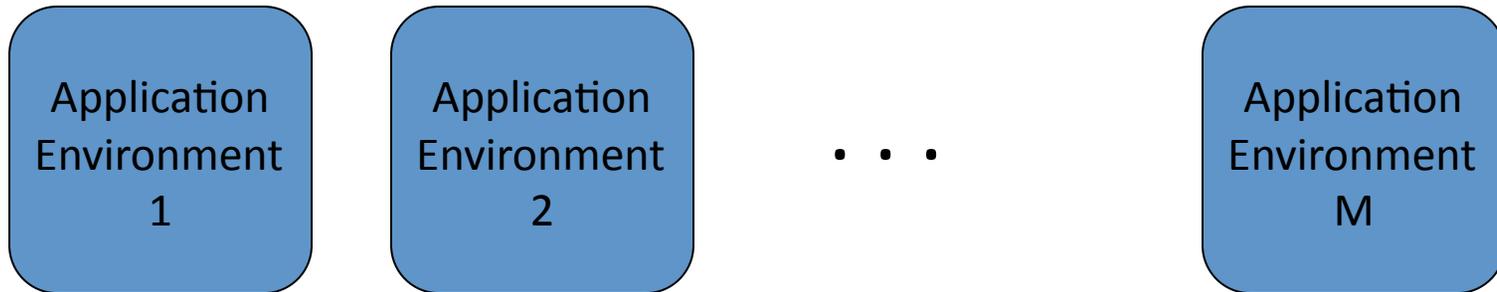
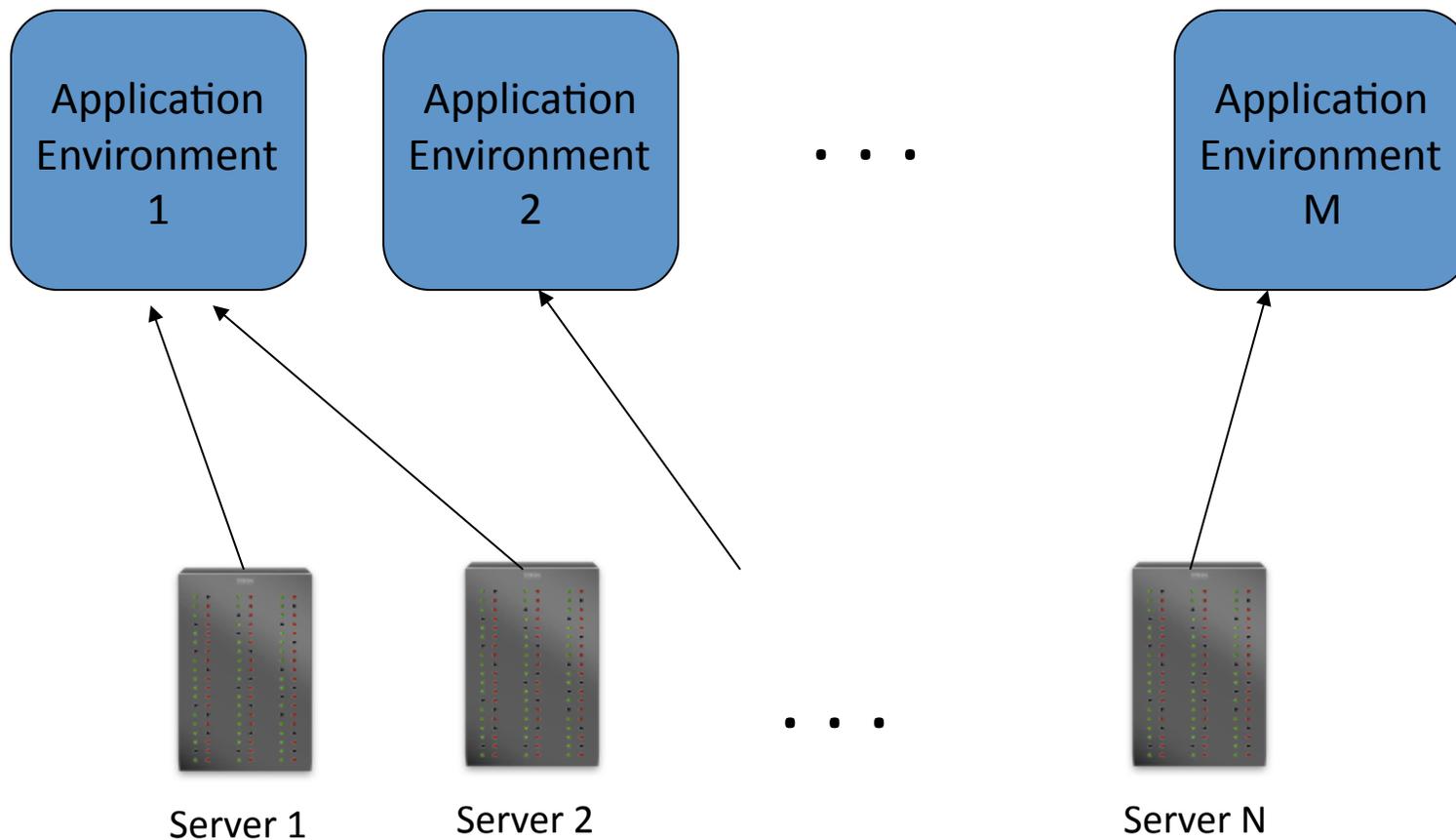


Figure 15: QoS Values With and Without Control.

# Dynamic Resource Allocation Problem



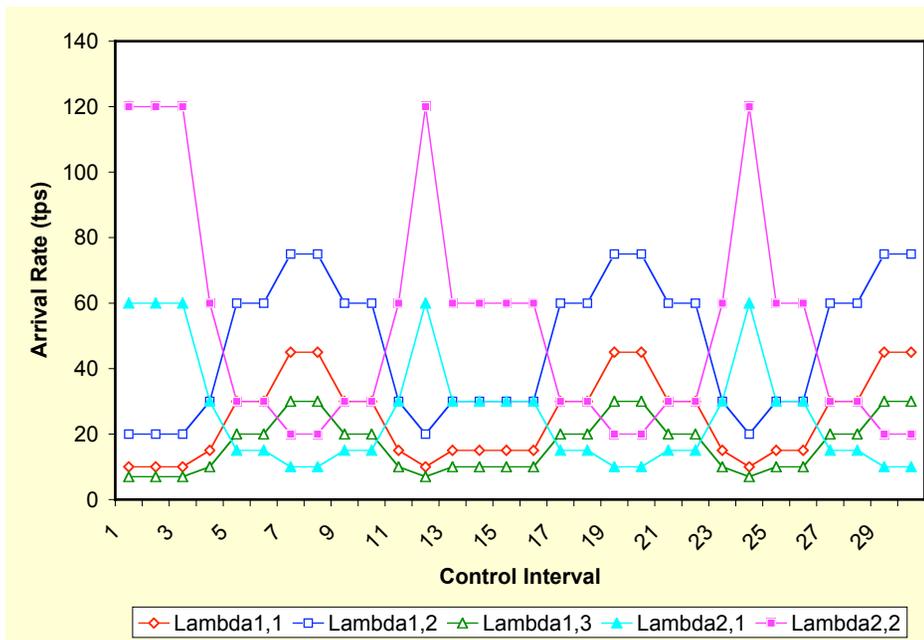
# Dynamic Resource Allocation Problem (cont'd)



IEEE International Conference on Autonomic Computing, 2005.

## Resource Allocation for Autonomic Data Centers using Analytic Performance Models

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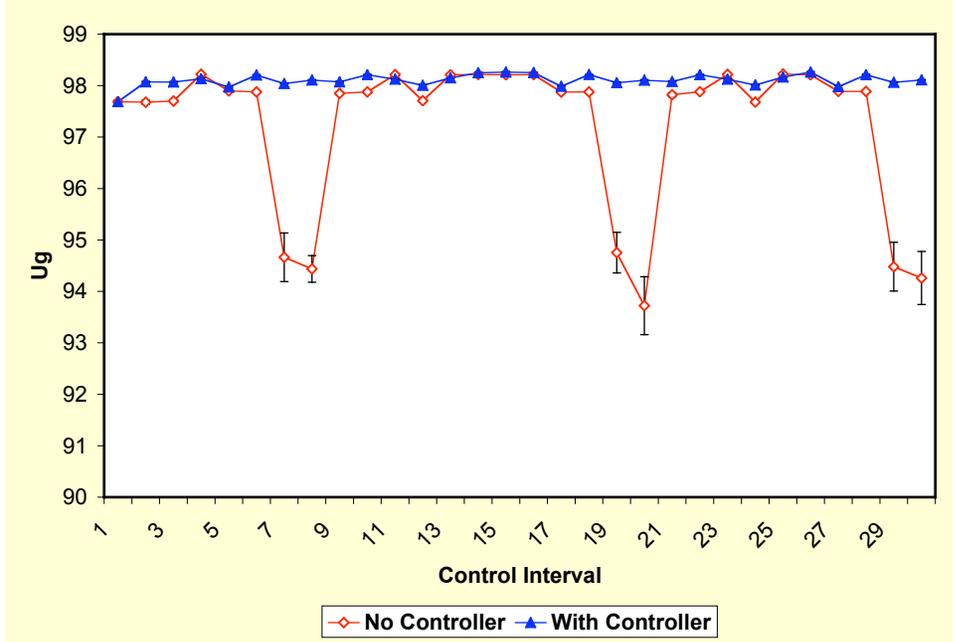
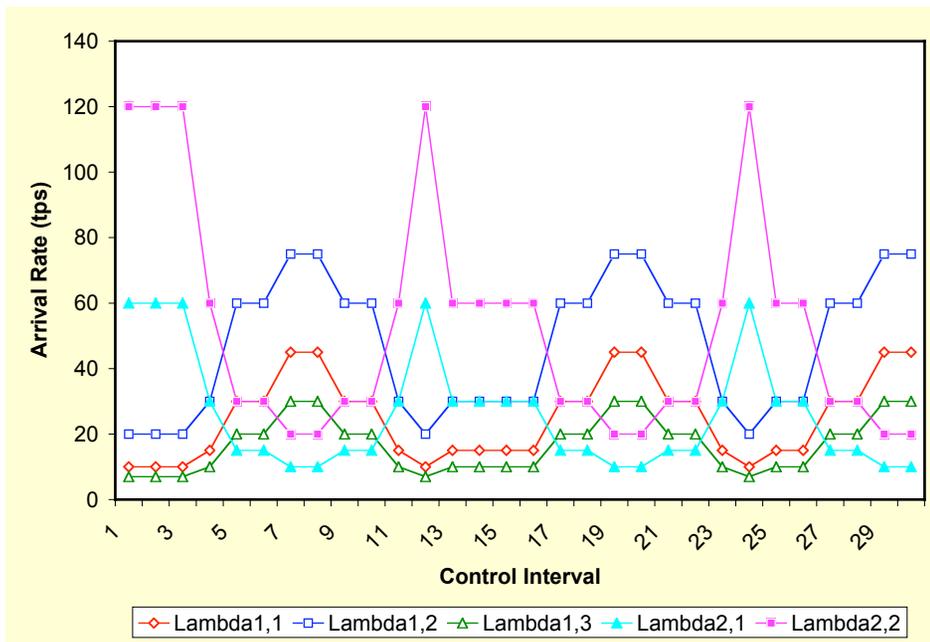


- The peaks and valleys of the workloads are out-of-synch to force resource redeployment.

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- The controller redeploys resources and keeps the system utility at high levels.



# Other applications of Autonomic Computing

ICAS'06

## Autonomic Virtualized Environments

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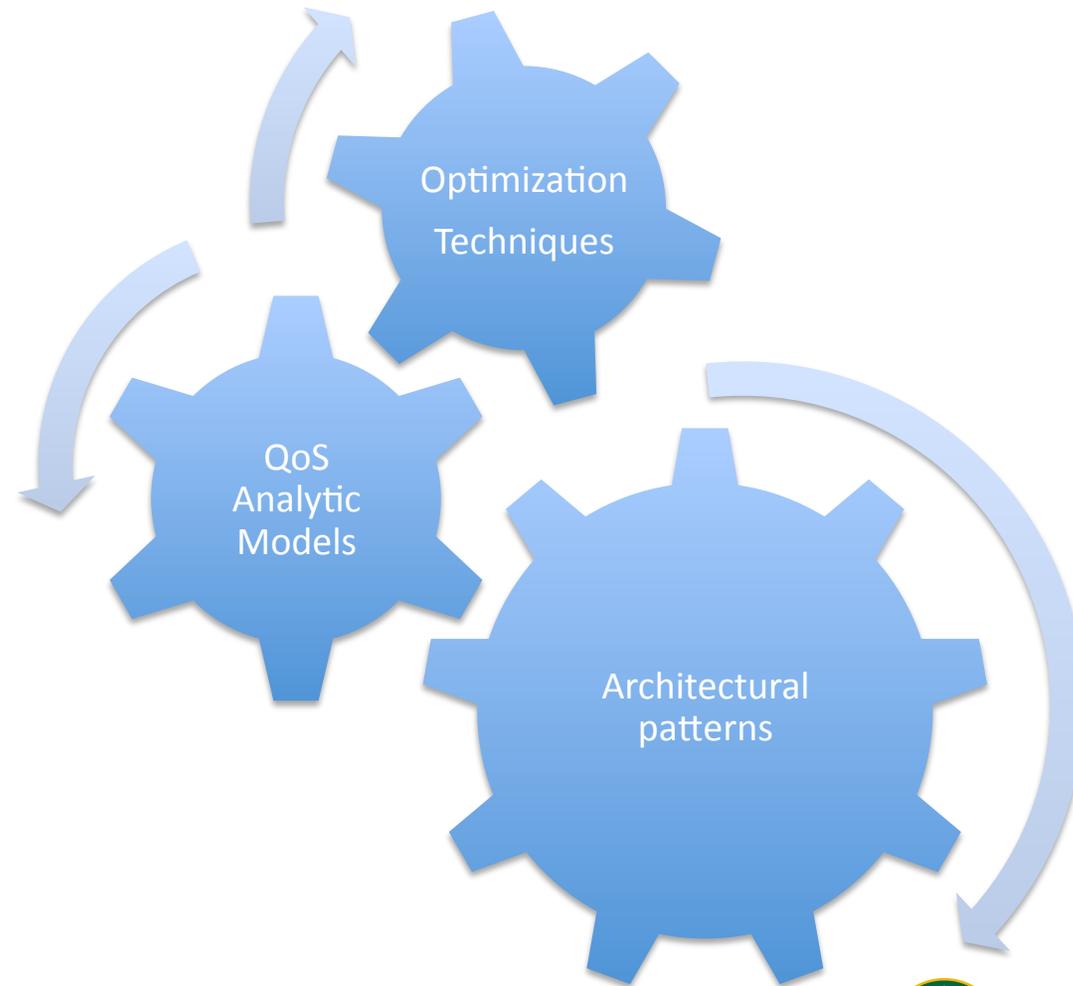
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## Business-Oriented Autonomic Load Balancing for Multitiered Web Sites

MASCOTS'09

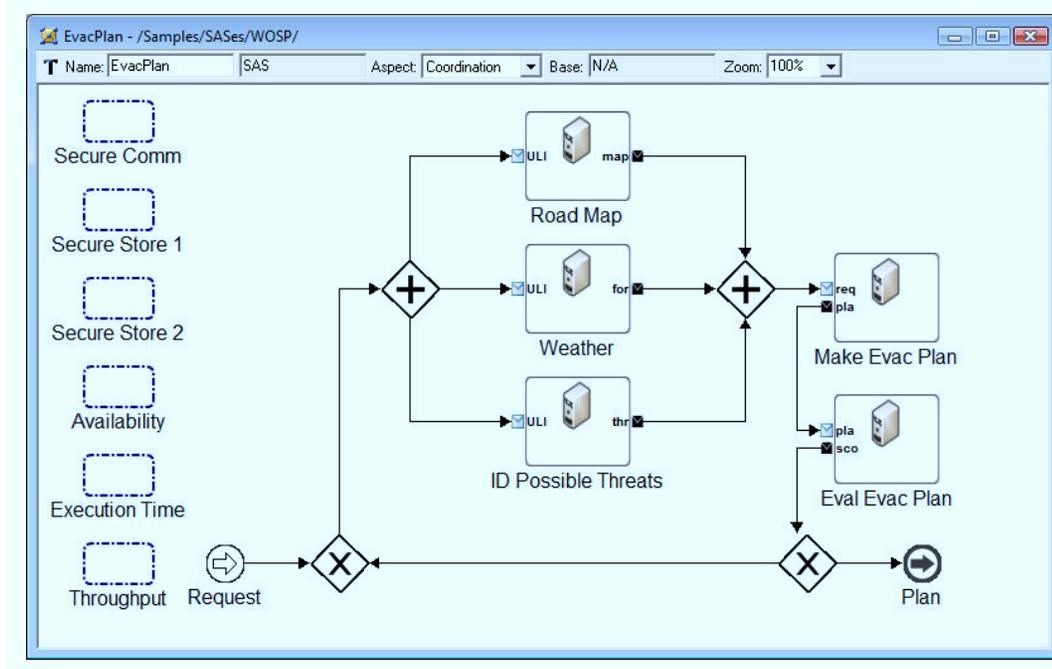
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# Self-Architecting Software Systems (SASSY)



## A Framework for Utility-Based Service Oriented Design in SASSY

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**Figure 2:** Example of a service activity schema (SAS) for an emergency response application.

## A Framework for Utility-Based Service Oriented Design in SASSY

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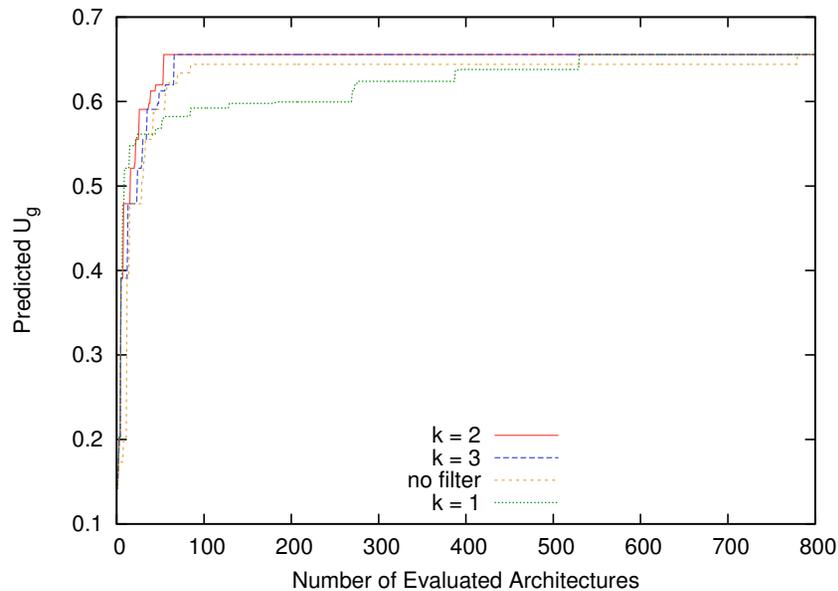


Figure 6: Variation of the global utility during the search.

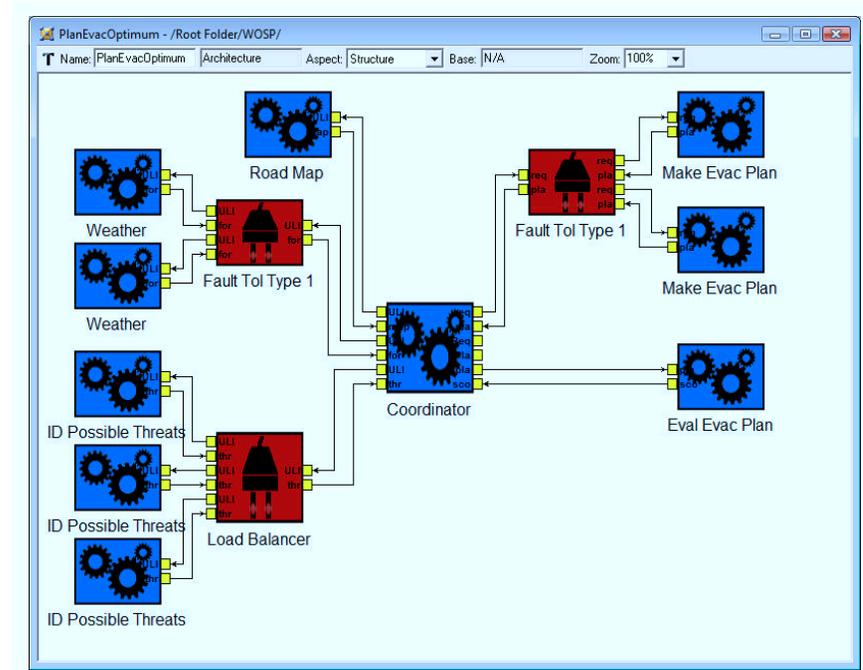


Figure 7: Optimal architecture.

# The Importance of Models?

- They allow us to devise and compare design alternatives, answer what-if questions regarding existing systems or systems being designed.
- They allow us to build controllers that automatically reconfigure and optimize a computer system so that the best QoS is obtained at any load-level.

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# The End

## Questions?

