

SIMULATION AND MODELLING

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Syllabus

Part I (Tony)

1. Introduction
2. Operational laws
3. Poisson processes
4. Discrete-event simulation
5. Markov processes

Part II (Giuliano)

1. Markovian queues
2. Open queueing networks
3. Fork-join subsystems
4. Application examples
5. Parallel discrete-event simulation



Suggested Books

- ▶ Performance Modeling and Design of Computer Systems:
Queueing Theory in Action
Mor Harchol-Balter
Cambridge University Press, 2013
- ▶ Probability, Markov Chains, Queues and Simulation
William Stewart
Princeton University Press, 2009
- ▶ Discrete-event System Simulation (5/e)
J. Banks, J.S. Carson, B.L. Nelson and D.M. Nicol
Prentice Hall International, 2010
- ▶ Simulation Modeling and Analysis
A.M. Law and W.D. Kelton
McGraw Hill, 2000



Introduction

- ▶ This course is about using measurements and models to understand performance aspects of real-world systems
- ▶ We'll focus on computer systems but the principles are widely applicable
- ▶ Performance models capture the way jobs/customers/entities move around a system and compete for its resources
- ▶ It then becomes a tool for reasoning about the system's performance, e.g. in order to:
 - ▶ Understand the observable behaviour of an existing system
 - ▶ Guide changes, rewrites or upgrades to a system
 - ▶ Study new or imaginary systems

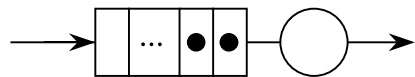


Applications

- ▶ There are many application areas, e.g.
 - ▶ Compute/web servers
 - ▶ Cloud computing/storage systems
 - ▶ Distributed systems
 - ▶ Mobile & sensor networks
 - ▶ Manufacturing
 - ▶ Transport & logistics
 - ▶ Healthcare provision
 - ▶ Military logistics & strategy
- ▶ We'll (try to!) balance theory and practice, so you'll understand how/why the techniques you'll be learning work



Consider an operating system scheduler where the job sizes (X) are highly variable



$$10 \leq C_X^2 = \frac{VAR(X)}{E(X)^2} \leq 50$$

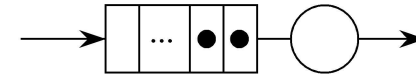
Rank the following schedulers in order of mean processing time per job:

- ▶ Round Robin (preemptive)
- ▶ First-Come-First-Served
- ▶ Shortest Job First (non-preemptive)
- ▶ Shortest Remaining Processing Time (preemptive)



Motivation: Some Example Problems

An in-memory TP system accepts and processes a stream of transactions, mediated through a (large) FIFO job queue:

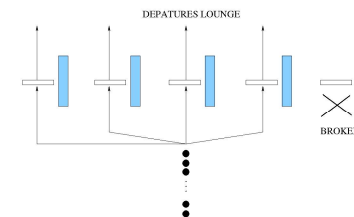


- ▶ Transactions arrive “randomly” at some specified rate
- ▶ The service times are distributed exponentially, with some specified rate

Q: If both the arrival rate and service rate are doubled, what happens to the mean response time?



There are five security scanners between the check-in and departures area at Heathrow (T4); one of them is broken:



- ▶ Around 0.5 customers pass through the terminal each second and it takes just under 8 seconds on average to scan each passenger
- ▶ The average delay is about 30 minutes (1600 seconds)

Q: How long would it take on average if all 5 scanners were working?

