

# Computer Systems Performance Analysis and Benchmarking (37-235)

Analytic Modelling  
Simulation  
Measurements / Benchmarking

**Lecture by:**  
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**Assignments/Projects:**  
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**Textbook:**  
Raj Jain, "The Art of Computer Systems Performance Analysis", 1991 Wiley & Sons, New York

## Topic of Today:

- Introduction
- Common mistakes ...  
... and how to avoid them

## Topics:

- Evaluation technique, performance metrics, workloads.
- Measurements: How to do the properly.
- Statistical technics.
- Design of experiments (measured, simulated).
- Simulation.
- More on workloads.
  - Survey of benchmarks.

## Example (Techniques, Metrics, Workloads)

What performance metrics should be used to compare the performance of the following systems?

- Two disk drives
- Two transaction processing systems
- Two packet retransmission algorithms

## Example: (Performance Measurements)

Which type of monitor (software and hardware) would be more suitable for measuring each of the following quantities?

- Number of instructions executed by a processor
- Degree of multiprogramming on a timesharing system
- Response time of packets on a network

## Example: (Statistical Techniques)

- The number of packets lost on two links was measured for four file sizes as shown below:

File Size:	Link A	Link B
1000	5	10
1200	7	3
1300	3	0
50	0	1

Which link is better?

## Example: (Design of Experiments)

The performance of a system depends on the following three factors:

- **Garbage collection technique used:** (concurrent, stop and copy, none)
- **Type of workload:** (editing, search (AI), scientific computing)
- **Type of CPU:** (DEC Alpha, IBM Power 2, Intel P6)

How many experiments are needed? How does one quantify the performance impact of each factor?

## Example (Queueing Network Models)

The average response time of a database system is 3 seconds. During a 1 min. observation interval, the idle time on the system was 1s. Determine the following:

- System utilization
- Average service time per query
- Number of queries completed during the interval
- Average number of jobs in the system
- $P[\# \text{ of jobs in the system}] > 10$
- 90 percentile, response time or waiting time

## Why is Performance Evaluation an “Art” and not a “Science”?

Example:

Throughput table [Transactions per second]

System:	Workload 1	Workload 2
A	20	10
B	10	20

What is a fair comparison?

### Absolute:

System:	Workload 1	Workload 2	Average
A	20	10	15
B	10	20	15

### Relative to B:

System:	Workload 1	Workload 2	Average
A	2x	0.5x	1.25x
B	1x	1x	1x

### Relative to A:

System:	Workload 1	Workload 2	Average
A	1x	1x	1x
B	2x	0.5x	1.25x

## How to Learn System Performance Analysis?

- **Learn the mathematical basics (done best in a lecture)**
- **Read articles on real studies critically (see the first assignment in Uebung)**
- **Do a project... (see suggested list)**

## Common mistakes... ...and how to avoid them

- **No goals**

There is no such thing than a general purpose model. Models are developed best with a clear goal in mind.

Example: model memory system performance with respect to communication operations in a parallel system.

- **Biased goals**

Show that OUR system is better than THEIRS.

- **Unsystematic approach**

Arbitrary selection of the parameter or thrive for cute theories rather than answers.

- **Analysis without understanding the problem**

A problem well stated is half solved. 40% is defining the problem, 60% is looking into alternatives, getting results, interpret them and conclude. Customers want an answer not a model per se.

- **Incorrect performance metrics**

Compare Mips for a CISC CPU vs. Mips for RISC CPU  
People go often for the easy metrics rather than the e.g. MHz clock frequency rather than the relevant ones.

- **Unrepresentative workload:**

Workloads have a high impact on the results. It is very tempting to construct a favorable workload for an evaluation.

- **Wrong evaluation technique:**

- Measurement
- Simulation
- Analytical modeling

People tend to choose what they know best, rather than what works best for the problem. The three different techniques have different strengths and limitations.

- **Overlooking important parameters**

List the characteristics of the workload and make sure you don't forget any characteristic that might be important. e.g. quantum sizes, working sets.

- **Ignoring significant factors**

Factors are parameters varied by the user. It is important to understand what is fixed and what is random, sometime even how the randomness works.

- **Inappropriate design**

Design is a question of coverage within the parameter space. Several techniques are given. Speciality of the author of our textbook.

- **Inappropriate level of detail**

Shallow high level models allow many alternatives. Narrow and detailed model restrict investigation to a few alternative but give much insight about them.

- **No analysis**

Study ends with a flood of data but lack of explanation.

- **Erroneous analysis**

There are a few classic mistakes like average of ratios etc... Don't get caught at a conference with such a bug!

- **No sensitivity analysis**

Computer scientists put too much emphasis on the result as a fact rather than on the evidence and how strong it is.

- **Improper treatment of outliers**

Deciding which outliers are inherent in the system and which ones by are just unrelated bad luck is very difficult. One needs to understand the system to model it.

- **Assuming no changes over time**

The future might be different, a good analysis can deal with change.

- **Ignoring variability**

Focus on the mean, max or min, insufficient effort to get variability under control (statistically).

- **Too complex analysis**

A simple analysis that leads to the same conclusion, with the same certainty, is always better than a complex one.

- **Improper presentation of results**

One can go to a top systems conference like ASPLOS and still find bar charts about branch prediction with a range from 88% to 93%. Books have been written on that. e.g. "Wie lügt man mit Statistik".

- **Ignoring social aspects:**

Modeling and analysis are substantive technical skills. Writing and speaking are social skills. Hint: combine them!

- **Omitting assumption and limitations**

Those are often omitted, due to page limitations or because they are inconvenient to explain. This leads other user to apply the results out of context.

## Textbook:

Raj Jain, "The Art of Computer Systems Performance Analysis", 1991 Wiley & Sons, New York, ISBN 0471503363

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