

Chair for Network Architectures and Services—Prof. Carle Department of Computer Science TU München

# **Discrete Event Simulation**

## IN2045

Overview on remaining chapters





- Chapter 0 Introduction and Motivation
  - We just had that a few seconds ago
- □ Chapter 1 Types of Simulation
  - This course coverse discrete-event simulation, but there also are other types of simulation, e.g., timebased simulation
  - Event-driven simulation
  - Process-oriented simulation



#### □ Chapter 2 – Statistics fundamentals

- Motivation:
  - Evaluating the results of a simulation involves a lot of statistics...
  - ...and designing a model usually does so, too.
  - Most of this should be known from highschool and/or from previous introductory courses
- Introduction: Waiting queue model
- Basic terms: Random variable (discrete + continuous), probability space, distribution functions (PDF, CDF), parameters: mean/average/expected value, median, mode, standard deviation, coefficient of variation, quantiles/percentiles/quartiles, skewness, spread, covariance, correlation, autocorrelation







- □ Chapter 3 Random variables
  - Motivation: Chapter 0 just showed that random numbers are an important simulation ingredient
  - How to generate random numbers that follow a specific distribution
    - Inversion method, accept-reject method, ...
  - Distributions and their characteristics
    - e.g., uniform, normal, exponential, lognormal,...
  - How to generate uniform [pseudo-]random numbers
    - Linear congruential generators, Mersenne Twister, ...
  - How to assess the quality of a [P]RNG
    - Autocorrelation, serial test, spectral test, ...
  - More statistics fundamentals:
    - Statistical tests
    - $\chi^2$  test



#### Example:

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#### **Autocorrelation Lag 4**



□ Chapter 4 – Evaluation of simulation results

- Estimators
- Confidence intervals
- Central limit theorem
  - Basically: "Do a lot of simulation runs, calculate averages, and you'll get a normally distributed output"
- Batch means
- Stationarity
- How to lie with statistics









Modellgestützte Analyse und Optimierung, Prof. Peter Buchholz, Technische Universität Dortmund

# How to lie with statistics; e.g.: Pie diagrams

□ What percentage does the pie represent?



Even if percentage is written out as text, we subconsciously get a false impression ("oh, that seems to be quite a lot")



#### □ Chapter 5 – Experiment planning

- Motivation:
  - Usually a lot of model/simulation parameters
  - Some have great influence on the results, but which ones are that?
  - We usually can't try out all possible parameter combinations
- Hypothesis testing, revisited
- Linear regression
- Analysis of Variances (ANOVA)
- Factorial design



Problem:

- □ Large number of parameters
- No detailed knowledge of the impact of the parameters

Idea:

 Variation of simulation parameters (valid configurations)

- Evaluation of the system performance
- Identification of the impact of each parameter on the system performance

Simulation / Parameter	X1	X2	X3	X4	Result (X1,X2,X3,X4)
# 1	+	-	-	+	38
# 2	0	+	+	0	12
# 3	I	0	-	+	43
# 4	I	+	+	+	12
# 5	I	-	-	I	15
# 6	0	0	Ο	0	8



□ Chapter 6 – Parallel simulation

- Motivation: General trend to parallel and distributed computing (e.g., multicore CPUs)
- Demotivation: It's complicated; the gain is much smaller than the number of CPUs; it usually makes more sense to run multiple simulations in parallel
- Conservative approach
  - Only evaluate events that are safe to process
  - CPUs need to synchronize on what's allowed and what not
- Optimistic approach
  - Go ahead and evaluate events
  - Be prepared to undo evaluation if it turns out that another CPU changes simulation state in the past (because it was slower in processing its events / had more events / ...)



□ Chapter 7 – Advanced topics

- Simulation of mobility (e.g., smartphones within a wireless network)
- Human mobility patterns
- Characteristics of mobility patterns (node distributions, speed distributions, correlated movements, ...)
- Synthetic mobility models
- Point fields
- Random graphs



- □ Example:
  - Wireless Communication (Disc Model)





Tools (in exercises):
OPNet
Matlab













http://www.mathworks.de/