Modeling and Simulation

Dr. G.H.J. Lanel

Lecture 1

Outline

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- Introduction To Modeling and Simulation
 - Introduce Modeling
 - Introduce Simulation
 - Model Building and Simulation
 - Choose The Appropriate Simulation Tools
 - Simulation World-views

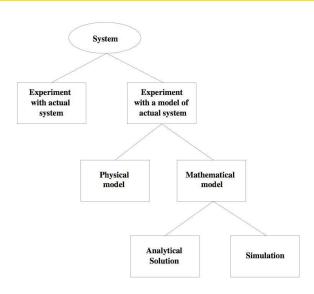
What is A model?

A representation of an object, a system, or an idea in some form other than that of the entity itself. (Shannon)

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- Mathematical: Analytical queuing models, linear programs, simulation.

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- Evaluating H/W and S/W requirements for a computer system.
- Evaluating a new military weapons system or tactics
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Applications: Ctd

- Designing and operating transportation facilities such as freeways, airports, subways, or ports.
- Evaluating designs for service organizations such as hospitals, post offices, or fast-food restaurants.
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- Put together a complete mix of skills on the team.
- Involve the end-user.
- Choose the appropriate simulation tools.
- Model the appropriate level(s) of detail.
- Start early to collect the necessary input data.

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- Block-structured Language
- Interpretive Execution
- FORTRAN-based (Help blocks)
- World-view: Transactions/Facilities

- English-like Problem Description Language
- Compiled Programs
- Complete language (no other underlying language)
- World-view: Processes/ Resources/ Continuous



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- Programmer / Analyst time
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Terminology: Ctd

- Attribute:
 - a property of an entity
 - E.g., checking account balance
- Activity:
 - Represents a time period of specified length.
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Pure Continuous Simulation

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 - Activity-oriented
 - Process-oriented
- Combined Discrete / Continuous Simulation

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Continuous Time and Discrete Time Models:

CPU scheduling model vs. number of students attending the class

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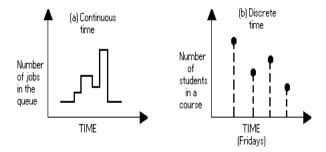
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 Continuous State and Discrete State Models: Does the system state evolve continuously or only at discrete points in time?

Example: Time spent by students in a weekly class vs. Number of jobs in Q.

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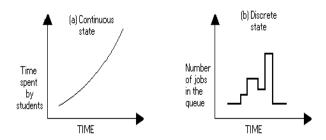
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Other types of models

 Deterministic and Probabilistic(Stochastic) Models: Does the model contain stochastic components?

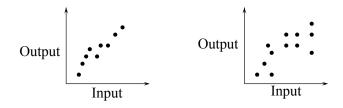
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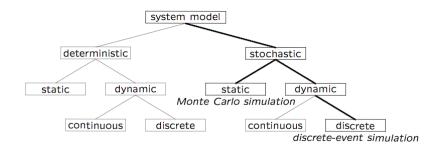
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- Build a conceptual model
- Convert into a specification model
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 - May involve equations, pseudocode, etc.
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Dr. G.H.J. Lanel (USJP)

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Lecture 1

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Modeling and Simulation

- Verification
 - Computational model should be consistent with specification model
 - Did we build the model right?
- Validation
 - Computational model should be consistent with the system being analyzed
 - Did we build the right model?
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- Techniques for Analysis



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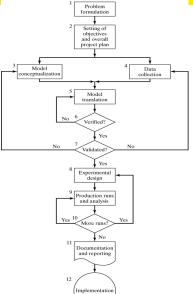
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Steps in Simulation study:



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End!