Simulation

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Course Contents and Evaluation Criteria

- Lectures
- Labs (three, last two assessable)
- Home assignments (two, assessable)
- Home exam (if you need grade 4 or 5)

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Important dates

- For home assignment 1: 6th of May
- For home assignment 2: 3rd of June
- For the home exam: 1st of September

If you miss a deadline you can not get a higher grade than 3.

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Literature

- A free compendium available from the university library, see the home page
- 2 Material on the home page
 - Home assignments
 - Skeleton code
 - Slides from the lectures
 - Course program
 - etc.

Course content

- Discrete event simulation (investigate system)
- Short intro to optimization
- Meta heuristics for simulated optimization

How does it fit together?

Simulation is done to find out different things:In this course, two main things

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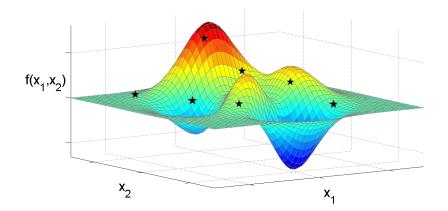
1) Find out properties and behaviour



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2) When we know how it works, can we improve (optimise) it?



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Assumed knowledge

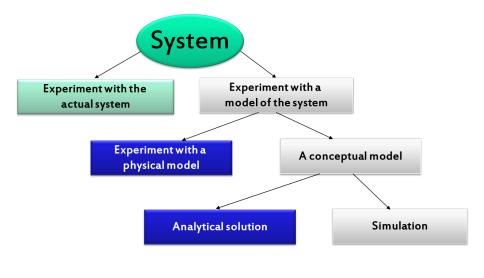
- Programming in JAVA (this is not a programming course)
- Basic statistics
- One lab will use Matlab and dare I say it, Excel.

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- Simple synonym: imitation
- We are interested in studying a system

But, instead of experimenting with the system itself we experiment with a model of the system

How to study a system



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Why not experiment with the system itself?

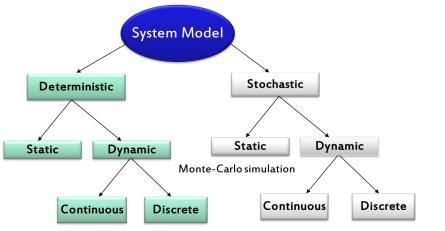
- It might be dangerous (control system in a nuclear power plant)
- 2 The system does not exist yet
- It is expensive to experiment with the system
- It is impossible to experiment with a system

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What kind of systems do exist?

- Continuous systems
 - Example: air pressure around an aeroplane
 - Are usually modelled by differential equations
- 2 Discrete systems
 - Example: systems described by queues
- Hybrid systems
 - Example: a bouncing ball (continuous dynamics before a bounce and discrete dynamics after each bounce

Characterizing a model



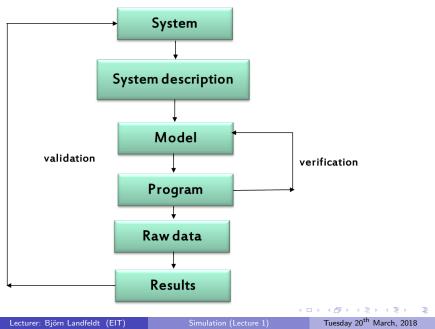
discrete-event simulation

Different kinds of models

- Continuous discrete
- 2 Static dynamic
- Deterministic stochastic

In this course our models will be discrete, dynamic and (usually) stochastic.

Steps in a simulation study



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Art and Science combined



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First Art then Science

- 1 First Art
- \star Analyse problem
- \star Build model / Structure scientific work
- 2 Then Science/Engineering
- \star Implement model / code
- ★ Verify
- \star Validate
- \star Interpret results

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Example application areas

- Communication systems
- Computer systems performance
- Transportation
- Manufacturing and material handling
- Health systems
- Economy
- Logistics

Advantages of simulation

- Makes it possible to predict impact of changes
- 2 Makes it possible to look at detailed behaviour
- Can give a good understanding of a system
- 4 Can visualize a system
- 5 Find bottlenecks in a system
- Gives a possibility to train a team

Disadvantages of simulation

- Model building requires special training
- 2 Time consuming and expensive
- Limitations of accuracy (approximations or rare events)

Modelling concepts

- A model is an abstract representation of a system
- A discrete model has
 - \star State variables
 - \star Events that change the state
 - ★ Rules that describes what shall happen at an event

Modelling concepts

- Entity represents an object that requires definition
 - Can move around (customers, airplanes etc.)
 - Can be static (bank clerk, highway crossing etc)
- Attributes entities have attributes, i.e. data connected to the attribute
- Resource an entity that serves other entities

Modelling structures

- Event-scheduling method
- Process-interaction method
- Other methods (later in the course)

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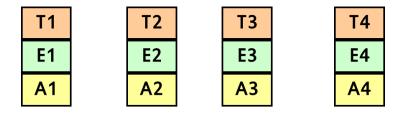
Event-scheduling method

The following is needed:

- **1** A description of the state
- 2 The events that can occur
- Rules describing what will happen if an event occurs

The Event List

Keeps track of when events shall happen

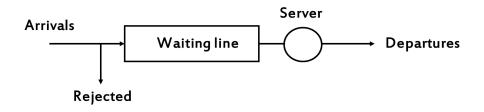


 T_i = time when event E_i will take place A_i = attributes to event *i* The list is sorted: $T_1 < T_2 < T3 < T_4$ etc.

How a simulation run is done?

- Extract the first element in the event list
- 2 Set Time = the time of the extracted event
- Update the state of the system and insert new events if needed
- If not finished, Go to 1

An example: a web server



It might be of interest to find

- Probability of rejection
- Mean (or variance) of time spent in system
- The mean number of customers in the system

Assume that we want to find the mean number of customers in the queue.

N = number of customers in the system

The appropriate state description depends on the results we look for.

Events that may take place

- Arrival
- Departure (when service is finished)
- Measurement (does not change the state)

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What do we also need to know?

Assume the following:

- The service time distribution is exponential with mean 2
- The mean time between arrivals is exponential with mean 3
- The number of places in the waiting line is infinite

Rule at arrival

N := N + 1;If N=1 then add departure to event list ; Add a new arrival to event list;

When we add the departure and arrival we have to draw a random number (exponentially distributed)

Rule at departure

N := N - 1;If N > 0 then add departure to event list ;

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Rule at measurement

Write (N); Add a new measurement to event list ;

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When the simulation begins

System State		Event List	
Sim_Time	Ν	Event_Time	Event_Type
0	0	3 5	Arrival Measurement

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System State		Event List	
Sim_Time	Ν	${\sf Event_Time}$	Event_Type
3	1	4	Arrival
		5	Measurement
		9	Departure

System State		Event List	
Sim_Time	Ν	Event_Time	Event_Type
4	2	5	Measurement
		9	Departure
		10	Arrival

System State		Event List	
Sim_Time	Ν	$Event_Time$	Event_Type
5	2	9	Departure
		10	Arrival
		14	Measurement

System State		Event List	
Sim_Time	Ν	${\sf Event_Time}$	Event_Type
9	1	10	Arrival
		12	Departure
		14	Measurement

Main Process

```
a := 3; (mean time between arrivals = 3)
s := 2; (mean service time = 2)
m := 10; (mean time between measurements = 10)
simulationLength := 1000;
No in queue := 0;
time := 0:
insert_event(measurement,Exp(m));
insert event(arrival, Exp(a));
while time < simulationlength do
begin
  dummy := FirstInQueue(eventlist);
  time := dummy.eventtime;
  case dummy.eventkind of
    arrival: arrive:
    departure: depart;
    measurement: measure;
  end:
end:
end.
```

Other Processes

```
procedure arrive;
begin
  if No in queue = 0 then
    insert event(departure,Exp(s));
  No in queue := No in queue + 1;
  insert event(arrival, Exp(a));
end:
procedure depart;
begin
  No in queue := No in queue - 1;
  if No in queue > 0 then
    insert event(departure, Exp(s));
end:
procedure measure;
begin
  write(utfil, No in queue);
  insert_event(measurement, Exp(m));
end:
```

First home assignment

You will get a Java program that simulates a simple queue. You shall modify that program and do some investigations.

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THE END

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