

# IFN501 - System Modeling and Simulation

## Session 3: Introduction to Computer Simulation (Part 2)

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# Outline

Different Types of Simulation

References

# Acknowledgement

When not specifically defined, the contents of this presentation are adapted from [1].

# Outline

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- ▶ Continuous

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- ▶ Monte Carlo

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- ▶ Discrete Event

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- ▶ Agent-based Modeling



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  - ▶ Competition between 2 populations
  - ▶ Population and/or urban growth



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- ▶ The use of random number generators gives Monte Carlo simulation characteristics not common to continuous simulation
- ▶ Example: paintball game between two groups

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- ▶ Example: Customers at an ATM
  - ▶ Events: arrive, wait for service, receive service, depart
  - ▶ The duration of each event can be different e.g follows certain distribution pattern (See Tables 1 and 2)

# Different Types of Simulation

## Discrete Event Computer Simulation – Example

Table 1 : Time between customer arrivals

Time (min.)	Percentage (%)	Time (min.)	Percentage (%)
1	5	6	20
2	7	7	10
3	8	8	8
4	10	9	7
5	20	10	5

Table 2 : Service durations

Time (min.)	Percentage (%)	Time (min.)	Percentage (%)
1	10	4	25
2	25	5	10
3	30		

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  - ▶ The machine was used 10898 times by 10898 customers
- ▶ The results can be used for evaluation and to determine if another machine is needed.

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  - ▶ Interaction rules or topology
  - ▶ Environment for interaction often consisting of constrained resources

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References

# References I

- [1] R. McHaney, [Understanding Computer Simulation](#). Ventus Publishing, 2009.