

# Introduction & Building Simulations

## Simulation and Modeling (CSCI 3010U)

Faisal Z. Qureshi

<http://vclab.science.ontariotechu.ca>



# Part I

Why do we care about simulations?

What is simulation? (Click to play video)

## Creating Simulations

Dr. Richard Gran

# Simulation

A model that you can manipulate to answer a question



# Simulation

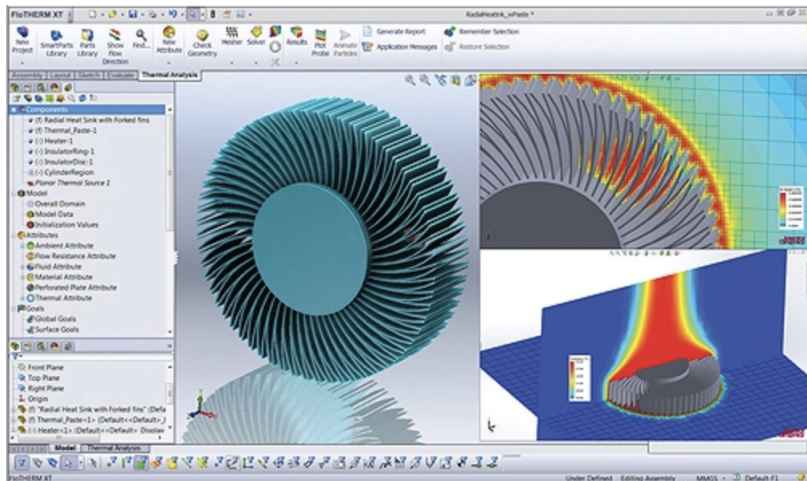
- ▶ A computational model of some phenomena
- ▶ More than a set of equations, or the solution of an equation at a particular point
- ▶ Ability to try out different scenarios, look at different situations, ask “what if” questions

## Designing better lights



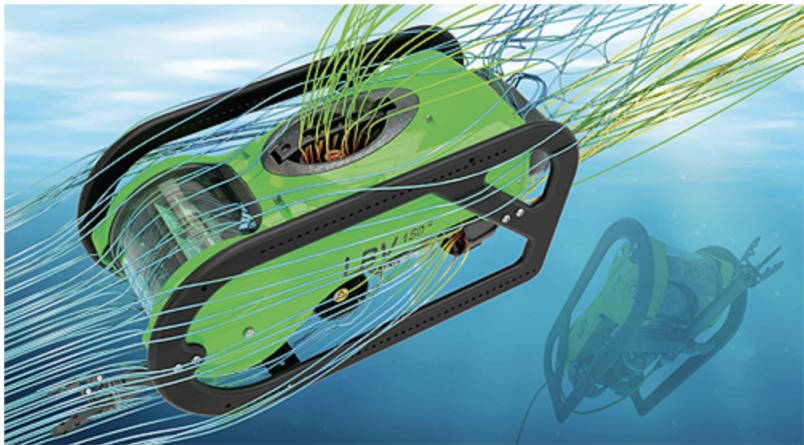
Courtesy <https://www.3dcadworld.com/using-simulation-guide-product-design/>

## Modeling thermal properties



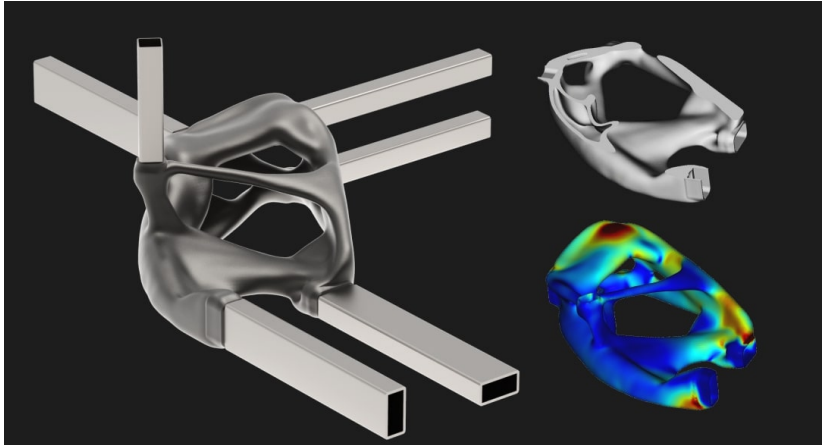
Courtesy <https://www.3dcadworld.com/using-simulation-guide-product-design/>

Simulations allows us to study various parameters



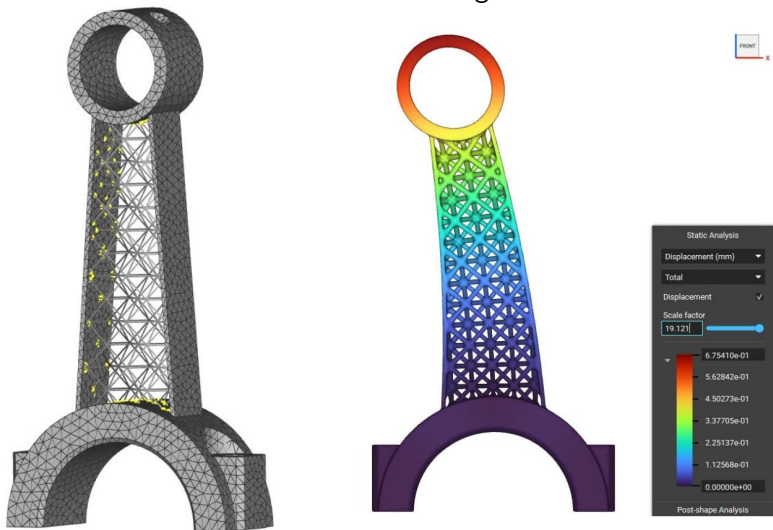
Courtesy <https://www.3dcadworld.com/using-simulation-guide-product-design/>

## Automotive applications



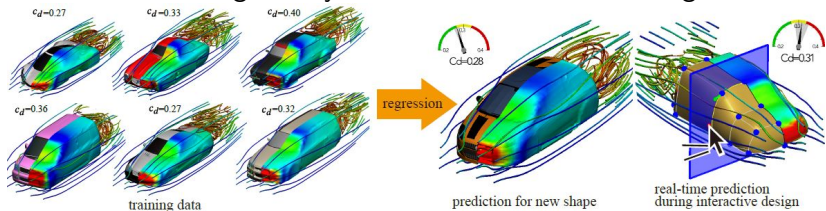
Courtesy <https://ntopology.com/blog/design-tips-structural-optimization-lightweighting>

## Structural design



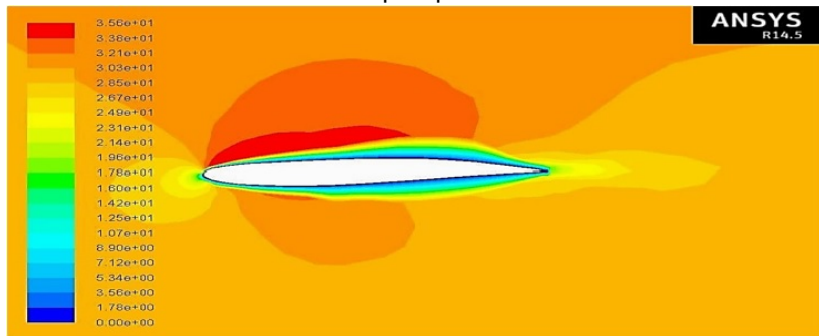
Courtesy <https://ntopology.com/blog/design-tips-structural-optimization-lightweighting>

## Modeling aerodynamics with machine learning



Courtesy <https://www.designnews.com/design-hardware-software/3d-aerodynamic-modeling-derived-machine-learning>

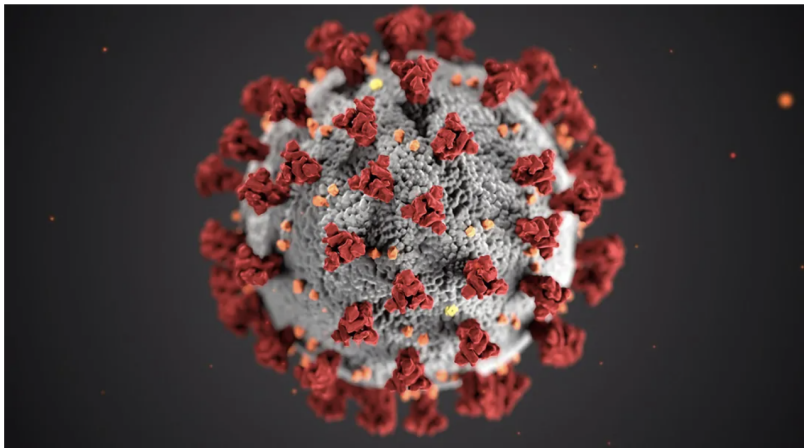
## Airfoil shape optimization



Courtesy <https://www.skyfilabs.com/project-ideas/flow-simulation-and-shape-optimization-of-airfoil>



## COVID-19 virus simulation on a supercomputer



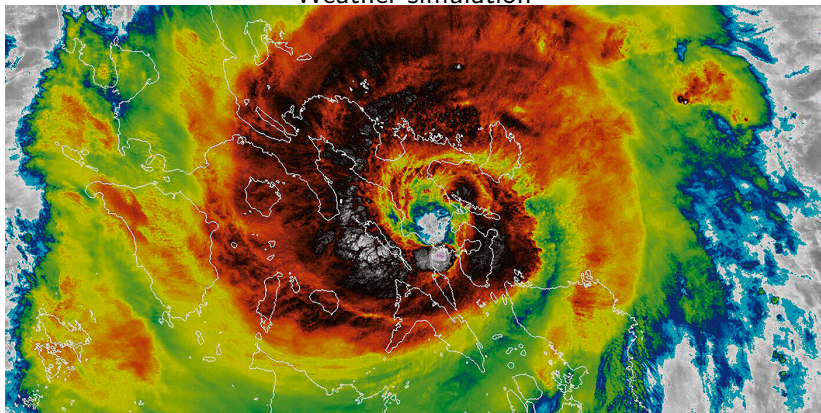
Courtesy <https://www.advancedsciencenews.com/supercomputer-simulates-molecular-model-of-sars-cov-2/>

## Crowd simulation



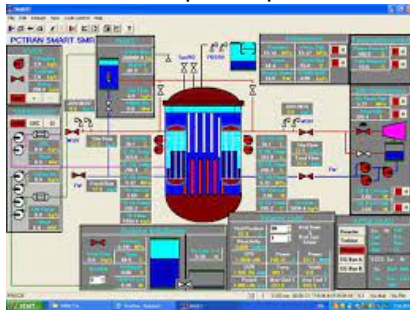
Courtesy <https://www.roadtovr.com/emergence-is-a-vr-crowd-simulator/>

## Weather simulation



tesy <https://redirect.cs.umbc.edu/2021/02/talk-modeling-and-simulation-for-reducing-risks-associated-with-extreme-weather-11-12-2->

## Nuclear power plants



Courtesy <http://www.microsimtech.com/>

## Driving simulators—cyber-physical systems



[https://www.researchgate.net/figure/Fixed-base-driving-simulator-consisting-of-a-driving-simulation-system-and-an-electric\\_fig1\\_333](https://www.researchgate.net/figure/Fixed-base-driving-simulator-consisting-of-a-driving-simulation-system-and-an-electric_fig1_333)

## Simulations for games: Simcity



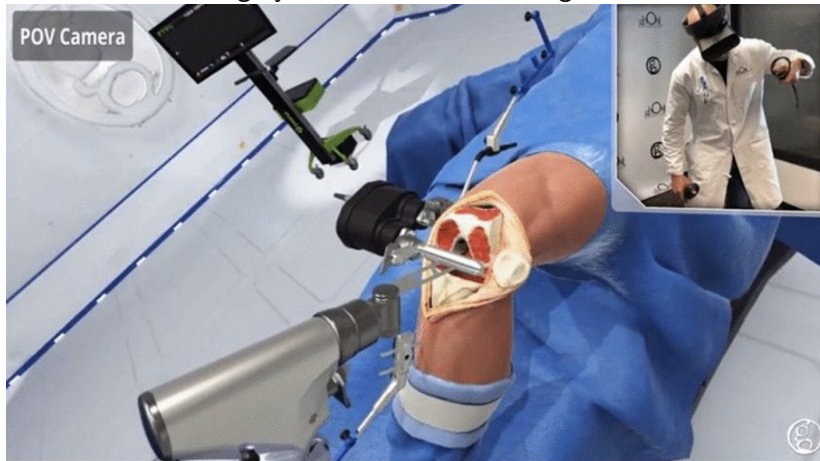
Courtesy <https://www.ea.com/games/simcity/simcity>

## Simulations for games: Factorio



Courtesy <https://cdn.factorio.com/assets/img/screenshots>

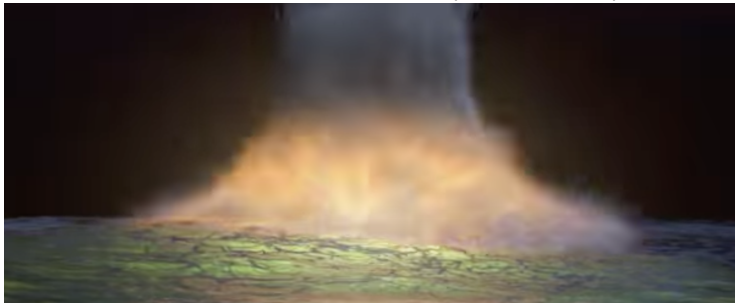
## Surgery simulations – serious games



Courtesy [https://www.researchgate.net/figure/Medical-VR-Total-Knee-Surgical-Simulator-Demo\\_fig2\\_355331835](https://www.researchgate.net/figure/Medical-VR-Total-Knee-Surgical-Simulator-Demo_fig2_355331835)

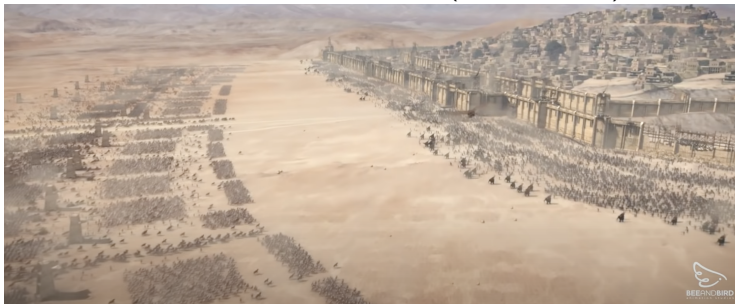


Movies and entertainment (Click to play)



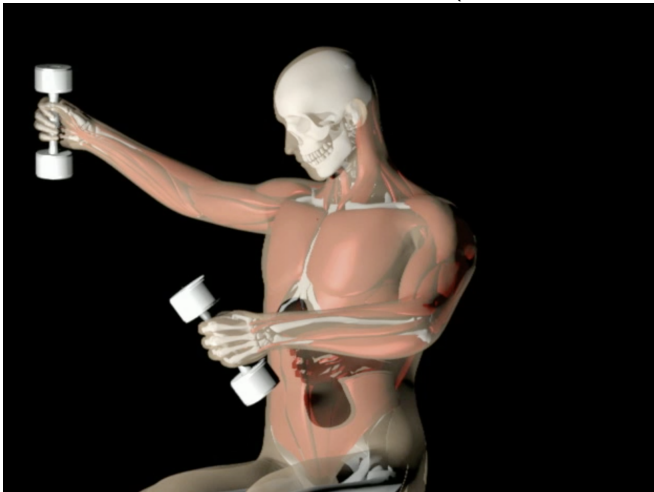
Courtesy <https://www.youtube.com/watch?v=F-FZzJdMyNk>

## Movies and entertainment (Click to play)



Courtesy <https://www.youtube.com/watch?v=rr6tDBeNEv0>

## Physically-based human body simulation (Click to play video)



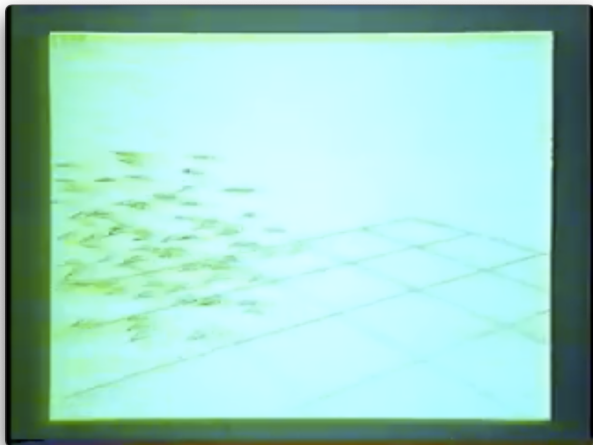
Courtesy <http://web.cs.ucla.edu/~dt/videos/human-body/>

Autonomous pedestrians (Click to play video)



Courtesy <http://web.cs.ucla.edu/~dt>

Boids models for flocks, schools, and herds (Click to play video)



Credits: C. Reynolds

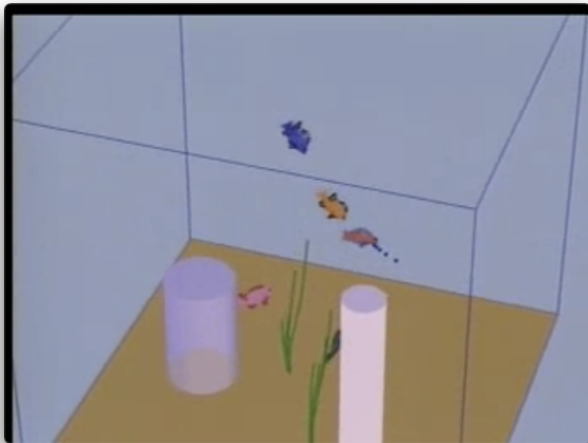
}

Cloth simulations (Click to play video)



Credits: R.GOldenthal, D. Harmon, and R. Fattal

Artificial fishes (Click to play video)



Courtesy <http://web.cs.ucla.edu/~dt>

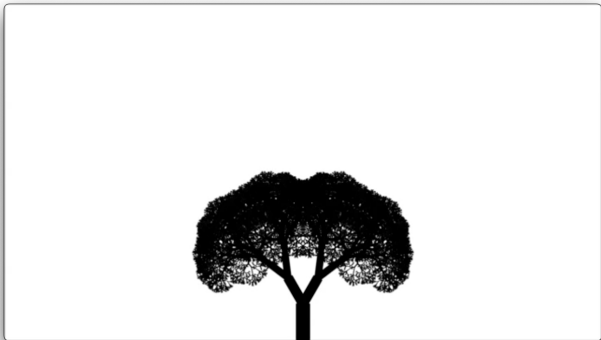
Human swimmer (Click to play video)



Courtesy <http://web.cs.ucla.edu/~dt>



L-systems for plants (Click to play video)

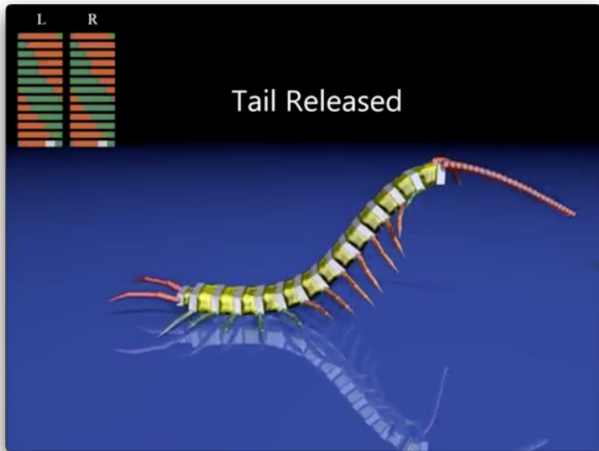


Credits: R. Gran

## L-systems for plants (Click to play video)



Myriopoda simulation (Click to play video)



Courtesy <http://web.cs.ucla.edu/~dt>

# Example: Car Simulation

## Applications

- ▶ Car design (model-based design)
- ▶ Road design
- ▶ Driver education
- ▶ Entertainment

## Things we can simulate...

- ▶ Physics of car motion
- ▶ Terrain or ground
- ▶ Controls and displays

## Benefits

- ▶ Evaluate car designs under different driving conditions
- ▶ Easy to carry out many design iterations

# Example: Military Simulation

## Scenario

- ▶ US Army uses tank simulations for tank designs
- ▶ Simulated tanks are pitched against each other in simulated battles comprising thousands of soldiers
- ▶ Designs that survive go to the prototype stage

## Assumptions about simulation

- ▶ Tank simulations relied upon data gathered during the first Gulf war, which had a lot of tank-vs-tank battles
- ▶ Second Gulf war didn't see much tank-vs-tank action; guerrilla warfare, road-side bombs, etc.
- ▶ The tanks that were designed for tank-vs-tank battle didn't perform well under these conditions

# Key Lesson

- ▶ Simulations are only as good as their input data
- ▶ One needs to be *very careful* in defining the scope of the problem
  - ▶ Consider all possible cases
  - ▶ Simulations can be incorrect even if there are no *mathematical* or *programming* errors
- ▶ The military simulations above did not take into account road-side bombs, which resulted in tanks that were not equipped to deal with such situations

# Why do we build simulations?

- ▶ Validate a model or a theory
- ▶ Perform experiments that are too expensive or too dangerous to carry out
- ▶ Training
- ▶ Model-based design
- ▶ Decision making and problem solving
- ▶ Education

# Validate a model or a theory

- ▶ Need some evidence that our theory is correct
- ▶ Does it behave the way we think it should?
- ▶ Does it mimic the real world?
- ▶ Where is it inaccurate?



# Performing experiments

- ▶ Simulations can be cheaper than real experiments, and give the same results
- ▶ What will happen in the case of severe weather? Don't want to actually destroy buildings or kill people!
- ▶ Control of nuclear reactors, pollution of water bodies, global warming, etc.

## Model-based design

- ▶ Producing prototypes is expensive, eliminate poor designs quickly using simulation
- ▶ Fine tune designs, test different parameter combinations quickly
- ▶ Try the design in real situations to see how it will perform

# Decision making and problem solving

- ▶ Even with a mathematical model the optimal solution may not be obvious
- ▶ May not be able to mathematically solve the problem
- ▶ What is the best number of bank tellers under particular conditions?
- ▶ How should an assembly line be configured?

# Education

- ▶ Show how something works, rather than talk about it
- ▶ Students can explore the model, try different things
- ▶ Active learning, see how the simulation responds, try theories and ideas
- ▶ Can build the simulation themselves

# Training

- ▶ Real equipment is expensive and dangerous
- ▶ Replicate training situations, such as bad weather and emergency situations
- ▶ Instructor can provide better feedback, pause the simulation and explain the problem
- ▶ More access to simulator than the real thing
- ▶ No ability to train on real thing, space program

“Human simulation” for applications in social sciences



Courtesy <https://humansim.org/what-is-human-simulation/>

# Part II

## Building simulations

# Building simulations

- ▶ Requirements
- ▶ Modeling
- ▶ Data Collection
- ▶ Implementation
- ▶ Validation
- ▶ Use



# Requirements

- ▶ Why are we building the simulation?
- ▶ How will it be used?
- ▶ We need to know what the problem is before we can start building a model and implementing the simulation
- ▶ The people who want the simulation can tell us how it will be used, what they need it for

# Gathering requirements

- ▶ Problem statement
- ▶ Background material, standards, etc.
- ▶ Accuracy of the simulation
- ▶ Time requirements, how fast must the simulation run?
- ▶ Important parameters
- ▶ Output

# Modeling

- ▶ We need to develop a model of the phenomena that we are simulating
  - ▶ How the system changes over time
  - ▶ How does it react to different events
- ▶ Two main classes of models
  - ▶ Continuous systems simulations
  - ▶ Discrete event systems simulations
- ▶ Continuous and DES simulations can be combined to construct hybrid simulations

# Continuous systems simulations

- ▶ View time as a continuous variable
- ▶ Differential equations describe how the *state* evolves over time
- ▶ Inputs are parameters, which can be controlled by the user

# Continuous systems simulations: Example

## Car simulator

- ▶ Variables: speed, heading, amount of fuel, etc.
- ▶ Inputs: steering wheel position, force on gas and brake pedals, road conditions, etc.
- ▶ Model: differential equations that take into account the forces (engine thrust, ground friction, etc.) acting on the car

# Discrete event systems simulations

- ▶ These focus on *events*
- ▶ Everything is based on the occurrence of events, which occur at discrete points in time
- ▶ An event often leads to more events in the future, and so on
- ▶ Events can begin to accumulate at some object, forming queues, and output is usually the average time the system takes to process an event
- ▶ Quite often involve statistics, probability distributions and queuing theory
- ▶ Can be used to model computer systems and networks

# Discrete event systems simulations: Example

## Automated Teller's Machines (ATM)

- ▶ Customers entering a bank
- ▶ What percentage of these customers use an ATM
- ▶ What do they use ATM for: withdrawals or deposit
- ▶ How long do they spend at the ATM
- ▶ When do these customers leave the ATM

# Data collection

- ▶ Most models will have parameters and input data
- ▶ Need to collect this information before you can implement or run the model
- ▶ Sometimes the information is easy to collect, such as different physical constants, just a matter of looking it up in a book
- ▶ Other types of data won't be readily available, average time for a teller to process a customer
- ▶ You may need to set up an experiment to collect the data, monitor bank tellers for several days and collect statistics



## Data collection as a part of the simulation results

- ▶ In some cases you may even need to guess, the data becomes part of the simulation problem?
- ▶ What values give reasonable results?

# Consistency in data collection

## Keep an eye on units

- ▶ With physical constants they must all use the same set of units, if not you will need to do conversions
- ▶ Equations won't work if the constants have different units, they will produce incorrect values
- ▶ This is a major source of errors

# Consistency in data collection

## Keep an eye on the process used to collect data

- ▶ In some cases if the data isn't collected in the same location it may not fit together, must be from same population
- ▶ In the bank example, all statistics should be captured in the same bank. Different banks could process customers in different ways, so mixing the statistics could produce meaningless results.
- ▶ This could be one of the hardest problems in simulation development

# Implementation

Produce a computer program for the simulation

## Continuous system simulations

- ▶ In the case of continuous system simulations this usually involves writing the program for the simulation
- ▶ We will use the open source physics framework that provides most of the program code
- ▶ We still need to convert the differential equations into program code, build the interface to the simulation

# Implementation

Produce a computer program for the simulation

## Discrete event simulations

- ▶ Discrete event simulations are a bit easier, standard programs exists for performing the simulation
- ▶ Must still describe the system to be simulated, the events and the objects that process the events
- ▶ Programs produce standard statistics
- ▶ May still need to program if you need something special

## Implementation considerations

- ▶ Implementation effort depends upon simulation application
- ▶ For some applications implementation is relatively easy, put something together quickly and let it run
- ▶ Often the case if the results aren't time sensitive, can afford to wait for the simulation to finish

# Time critical simulations

- ▶ In other cases time is important
- ▶ For training simulators you must have real time response, must respond to user input
- ▶ For weather predictions, must have tomorrow's weather before tomorrow arrives
- ▶ Some simulations could take years to run if they aren't implemented correctly

# Implementation

We will look at some of the implementation issues later in the course:

- ▶ Use of multiple processors to reduce time
- ▶ Handling large amounts of data in large simulations
- ▶ Networking and remote simulations



# Validation

- ▶ Before we can use a simulation we need to validate it, determine whether it is giving the correct values
- ▶ If the simulation is wrong, we don't want to use the results
- ▶ There are several ways that we can do this, the easiest is to compare the results to known values

# Validation

- ▶ If there is a special case where the output is known, then check this case
- ▶ Run the simulation in parallel with the real world
- ▶ Use known inputs, the current situation and see if the simulation predicts what actually happens
- ▶ Example: input today's weather conditions, and see if tomorrow's weather prediction is correct
- ▶ This only works if you can capture the required input

# Validation

- ▶ See if the simulation predicts known behavior
- ▶ If you know that a particular condition arises under certain circumstance, then see if the simulation produces similar results
- ▶ Not the best validation, but shows whether the simulation is going in the right direction

# Use

- ▶ In some cases the simulation will only be used a few times to answer a particular set of questions
- ▶ In other cases it will be used on a daily basis, in this case may need to update the simulation as conditions change

## Example

- ▶ A bank wants to improve service times, but doesn't know whether it should add tellers or ATMs
- ▶ Best answer may vary from bank to bank depending on customer mix, current facilities, etc
- ▶ Can use a simulation to help answer this question

## Example

- ▶ Really want to have satisfied customers, but this isn't something a simulation will tell us
- ▶ If they are serviced quickly, they are likely to be happy, and we can measure service time, so that will be our output
- ▶ Need to develop a model for this simulation

## Example

- ▶ Customers arrive at the bank, want to perform one or more transactions
- ▶ Customer arrival isn't continuous, arrive at discrete times -> discrete event simulation
- ▶ Model based on transactions, time to perform these transactions at teller and ATM
- ▶ Also model customer choice between teller and ATM

## Example

There will be a distribution of:

- ▶ Customer arrival time
- ▶ Number of transactions
- ▶ Type of transactions
- ▶ Preference for teller or ATM
- ▶ We will need to measure this information, could vary from one bank to another
- ▶ Also need to know the current number of tellers and ATMs



## Example

- ▶ Can use a standard discrete event simulation package for this problem
- ▶ Can verify the simulation by running it for several days using current bank - configuration and statistics
- ▶ Check if simulated waiting times agree with the measured waiting times

## Example

- ▶ Run the simulation with different numbers of tellers and ATMs
- ▶ Will need to run the simulation several times in order to obtain accurate results
- ▶ May also want to vary the inputs to see how sensitive the results are, does a small decrease in customer arrival time produce a much longer waiting time?

# Building simulations (Recap)

1. Requirements
2. Modeling
3. Data Collection
4. Implementation
5. Validation
6. Use

# Summary

- ▶ Examined the process of creating simulations
- ▶ Notice the parallels and the important differences with software engineering
- ▶ Identified two main types of simulations
  - ▶ Continuous systems simulation
  - ▶ Discrete event simulations
- ▶ Now we can start looking at the details of designing and implementing simulations, starting with continuous systems

# Copyright and License

©Faisal Z. Qureshi



This work is licensed under a Creative Commons Attribution-NonCommercial 4.0 International License.