#### Clustered Monte Carlo on Cloud Systems

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# Overview

- What Are Some of the Key Issues with Simulators today?
- What is a Monte Carlo Simulation?
- How Are Monte Carlo Simulations Useful to DoD?
- What Are Some of the Key Issues with Scaling Monte Carlo Simulations?
- How Have We Implemented Monte Carlo?
- How Can We Visualize the Results?
- Summary



# What Are Some of the Key Issues with Simulators today?

- Most users are forced to run one-time discrete event simulators as few SE modeling tools have a Monte Carlo capability
- Many users choose not to run simulations as their set up is complex and (in discrete event) their results are inaccurate

– Often ignoring the 10% chance they fail

 Monte Carlo simulations are computationally expensive and are user time-consuming



## What Is A Monte Carlo Simulation?

- Modern version came from Los Alamos during the late 1940s
  - Stan Ulam, Nick Metropolis, and John Von Neumann
- Repeatedly samples random distributions to calculate non-deterministic problems
  - Critical as most measures have significant variances, which we capture as distributions
- Used in fluid dynamics calculations (e.g., aerodynamics), sensitivity analyses, and quantitative risk analysis

This technique has proven very useful for DoD problems



## How Is Monte Carlo Useful to DoD?

- Statistical many-on-many engagement models
- Weather prediction/forecasting
- Support to V&V of complex, expensive systems
- Weapons effects modeling
- Cost estimation
- Fault-tree analysis



New applications emerge every day



## What Are Some of the Key Issues with Scaling Monte Carlo Simulations?

- Most Monte Carlo simulators are single threaded
- Almost all are designed for a single desktop or server
- All resources of a single desktop or server are cannibalized; reducing worker productivity



# How Have We Implemented Monte Carlo?

- We developed a multi-thread, modularizing simulator
- The simulator scales automatically to use as many servers as needed for a particular problem
- Statistics are calculated in real time
- Uses advanced, scalable database technologies



## Action Modeling (Functional View)



We use the Discrete Event Simulation to test out paths and algorithms – we then use the Monte Carlo to gather statistically relevant information



# **Voting Computers**



- Functional model equivalent using Action Diagram
- Timing provided for each computer can be a random distribution, as can failure modes



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# Monte Carlo Simulation of Action Diagram

Duration	Cost Resource				
	Navigate FireSAT		Total Simulation Duration		
	1.910 s	6.23103992ms	1.910 s	6.23103992ms	
	mean	standard deviation	mean	standard deviation	
	Correct Position		20 - 24 - 22		
		Detect Position	14		
	Vote on Results				
				- <sup>2</sup>	

 Executing the model with random time distributions provides way to derive key metric requirements



#### Another Example: Disaster Response



- Usually, a significant amount of disaster management planning has been done
  - Supplies are pre-positioned by State and National organizations (e.g., FEMA)
  - Detailed roles and responsibilities, MOU, contracts, etc. have been negotiated
- Focus on "Conduct Response Efforts"



## Decomposed "Conduct Response Efforts"



# Alternative 1: Make Ice Locally



- Adds complexity as significant amount of fault tolerance occurs on-site
- Less expensive option



## **Discrete Event Simulation Results**



- Includes cost of setup, water and power needed to produce ice
- Total accumulated cost over 11 day <\$7,000</li>



# Monte Carlo Simulation Results

= MENU + Database Requirements Search Share Innoslate Timeline and + Steve Dam + 🥤								
► Start								
Success! Monte Carlo simulation has been successfully started. Artifact will be created once simulation is completed.								
Duration	Cost Resource							
	Alternative 1: Ma	ake Ice Locally	Total Simulation Cost					
	\$6973.75	\$41.03	\$6973.75	\$41.03				
	mean	standard deviation	mean	standard deviation				
Water to ice Ma	chines Supply	y Power to Ice Machines	1000 Iterations					
Make Ice	S	Setup ice Machines						

Note: Monte Carlo is only available on Pro Version



# Alternative 2: Bring In Ice



- Less complex process
- More expensive



### **Discrete Event Simulation Results**



- Cost accumulated by process steps over 11 day period
- Total accumulated cost >\$160k



# Monte Carlo Simulation Results

			Share Innoslate Timeline and • Steve Dam •				
► Start							
Success! Monte Carlo simulation has been successfully started. Artifact will be created once simulation is completed.							
Duration Cost Resource							
Alternative 2: Procure and Transport Ice		Total Simulation Cost					
\$166720.53	\$4462.67	\$166720.53	\$4462.67				
mean	standard deviation	mean	standard deviation				
Ship ice to Sife		1000 Iterations					

Note: Monte Carlo is only available on Pro Version



## Summary



# Summary

- The cloud allows for Monte Carlo simulations that:
  - Scale automatically
  - Complete quickly
  - Increase worker productivity (the worker no longer has to wait for a simulation to finish to continue working)
  - Increased accuracy of model

