# Méthodologies d'expérimentation pour l'informatique distribuée à large échelle

Martin Quinson

March 8th, 2013







# **Doing Science = Acquiring Knowledge**



 $\frac{\partial}{\partial x_i} \left( \frac{\partial \Phi}{\partial x_i} \right) = \frac{\partial}{\partial x_i} \left( \frac{\partial \Phi}{\partial x_i} \right)$ 



#### **Experimental Science**

- Thousand years ago
- Observations-based
- Can describe
- Prediction tedious

#### **Theoretical Science**

- Last few centuries
- Equations-based
- Can understand
- Prediction long

**Computational Science** 

- Nowadays
- Compute-intensive
- Can simulate
- Prediction easier

Prediction is very difficult, especially about the future. - Niels Bohr

# **Observations still base Science**

#### Space telescope



#### NMR Spectroscope



Tsunamis



Large Hadron Collider



#### Synchrotrons



#### Earthquake vs. Bridge



#### Mars Explorer



#### Turntable



#### Climate vs. Ecosystems



(who said that science is not fun??)

# **Computational Science**



# **Computational Science**



#### Understanding the Climate Change with Predictions







# **Computational Science**



#### Understanding the Climate Change with Predictions







# Models complexity grows

#### This requires large computers

Upscale project:

15,000 computing-years in 2012!

Martin Quinson Computational Science of Computer Systems Introduction CS<sup>2</sup> SimGrid PDES Formal Open Science Conclusion 4/30 🖗

# Modern Computers are Large and Complex

# Massive Parallelism

- Cannot miniaturize further (atom limit)
- Cannot increase frequency (energy limit)
- Solution: Multiply compute cores!
- ► Sequoia, second fastest computer: 1,572,864 cores



## ExaScale Systems, used in Computational Science

- Systems computing 1 Exaflop per second arrive (with *billions* of cores)
- ▶ 1 Exaflop =  $10^{18}$  operations. One million million million operations...
- ▶ At humanly doable speed, that requires 10 times the age of the universe
- ► Each node: 20 millions lines of code (10× Encyclopedia Britannica)

#### Other very large computer systems in the wide

- Google computers dissipate 300MW on average (150,000 households,  $\frac{1}{3}$  reactor)
- Botnets: BredoLab estimated to control 30 millions of zombie computers
- ► In addition, these systems are heterogeneous and dynamic

This essential complexity mandates adapted scientific instruments

#### Research Field: Methodologies of Experimentation

- ► Assessing the performance and correctness of large-scale computer systems
- Meta-research on producing scientifically sound results
- Main contribution: SimGrid, a large-scale computer systems simulator

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#### **Epistemological Stance**

- Empirically consider large-scale computer systems as natural objects
- ► Eminently artificial artifacts, but complexity reaches "natural" levels
- Other sciences routinely use computers to understand complex systems

# **Assessing Distributed Applications**

#### Correctness Study $\rightsquigarrow$ Formal Methods

Tests: Unable to provide definitive answers

#### Performance Study $\rightsquigarrow$ Experimentation

Maths: Often not sufficient to fully understand these systems

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- Experimental Facilities: <u>Real</u> applications on <u>Real</u> platform (in vivo)
- Simulation: Prototypes of applications on system's <u>Models</u> (in silico)

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Experimental Facilities: <u>Real</u> applications on <u>Real</u> platform (*in vivo*)
 Emulation: <u>Real</u> applications on <u>Synthetic</u> platforms (*in vitro*)
 Simulation: Prototypes of applications on system's Models (*in silico*)

# Simulating Distributed Systems

Big Idea: Simulation is the fastest path from idea to scientific results



### Comfort to the user

- Get preliminary results from partial implementations
- Experimental campaign with thousands of runs within the week
- Test your scientific idea, ignore technical subtleties (for now)

### Challenges for the tools

- Validity: Get realistic results (controlled experimental bias)
- Scalability: Fast enough and Big enough; Tooling: runner, post-processing

### Scientific practices sometimes unfortunate in this field

- Experimental settings not detailed enough in literature
- Many short-lived simulators; few sound and established tools

#### Scientific Instrument

- ▶ Versatile: Grid, P2P, HPC, Volunteer Computing and others
- Sound: Validated, Scalable, Usable; Modular; Portable
- Community-driven: 30 contributors (5 not affiliated), 5 contributed tools, GPL

# Scientific Object

- Allows comparison of network models on non-trivial applications
- High-Performance Simulation on realistic workload
- ► Full model checker of distributed applications; Emulator under way

### Large Established Project

- Started in 1998; Collab. Loria / Inria Grenoble / CC-IN2P3 / U. Hawaii
- Impact: 120 publications (110 distinct authors, 5 continents), 4 PhD
- ► Co-leader with A. Legrand (CNRS Grenoble) and F. Suter (CNRS IN2P3)

# **Simulation Validity**

SotA: Models in most simulators are either simplistic, wrong or not assessed

- PeerSim: discrete time, application as automaton;
- GridSim/CloudSim: naive packet level or buggy flow sharing
- OptorSim, GroudSim: documented as wrong on heterogeneous platforms

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- ► Flow-based: Contention, Slow-start, TCP congestion, Cross-traffic effects
- Constant time: A bit faster, but no hope of realism
- Coordinate-based: Easier to instantiate in P2P scenarios
- Packet-level: NS3 bindings



# Major Contributions (with many contributors)

- 1/ Proto-Emulation: Assessing Real Applications
  - ► GRAS: Middleware to run simulation prototypes on real platforms
  - SMPI: Study real MPI applications within SimGrid
- 2/ HPS: High Performance and Scalable Simulation
  - ► Fast Enough: Innovative PDES; Efficient algorithms and implementations
  - ► Big Enough: Scalable and versatile platform representation
- 3/ Formal: Correctness Studies in SimGrid
  - Seamless integration of a complete Model Checker (enforces code invariants)
  - > Exhaustive reachability analysis, with innovative versatile DPOR technique

# Scientific Community Management

- ▶ Project Coordinator: 2 ANR projects, 1 regional CPER project (total: 4M€)
- ► Methodological convergence: Board member of Grid'5000 experimental grid
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# Parallel Simulation of Discrete Event Systems

- ▶ 30 years of literature on efficient Simulation Engines, FES and distribution
- ▶ Yet, all DES simulator for P2P were sequential (but dPeerSim)

# The dPeerSim attempt

- Distributed implementation of PeerSim
- Classical parallelization: spreads the load over several Logical Processes (LP)



#### Evaluation

- $\blacktriangleright$  Uses Chord as a standard workload: e.g. 320,000 nodes  $\rightsquigarrow$  320,000 requests
- $\blacktriangleright$  Very good speedup results: 4h on 2 LPs  $\rightsquigarrow$  1h on 16 LPs
- ▶ But 47s in the original sequential PeerSim (and 5s in precise SimGrid)
- ► Yet, best known parallelization of DES simulator of P2P systems

# New Parallelization Schema for DES



# **Toward Parallel P2P Simulation in SimGrid**

Keep models sequential, execute processes in parallel OS-inspired Approach toward Process Separation

- > Fine-locking would be difficult, inefficient and would hinder reproducibility
- Mediate any process interactions through simcalls (conceptually identical to syscalls of real OSes)



#### **Temporal View**



# Leveraging Multicores

**Functional View** 

 $\Rightarrow$  More processes than cores  $\sim$  Worker Threads (execute co-routines ;)



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# Sequential Performance in State of the Art

- ► Scenario: Initialize Chord, and simulate 1000 seconds of protocol
- Arbitrary Time Limit: 12 hours (kill simulation afterward)



# **Benefits of the Parallel Execution**



• Speedup  $\left(\frac{t_{seq}}{t_{par}}\right)$ : up to 45%

- More efficient with simple model:
  - Less work in engine + Amhdal law
- Speedup depends on thread amount
  - ▶ 8 threads (of 24 cores) often better
  - Synch costs remain hard to amortize
  - They depend on thread amount

# Parallel Efficiency $\left(\frac{speedup}{\#cores}\right)$ for 2M nodes

Model	4 threads	8 th.	16 th.	24 th.
Precise	0.28	0.15	0.07	0.05
Constant	0.33	0.16	0.08	0.06

- Baaaaad efficiency results
- Remember, P2P and Chord: Worst case scenarios

#### Yet, first time that Chord's parallel simulation is faster than best known sequential

# **Future Work on HPS**

### Distributed Simulation toward size

- Leverage the memory of more nodes; Useless in P2P, more adapted to SMPI
- Design: split our design under the simcall layer



# **Functional View**

### Increase level of parallelism

- Pessimistic execution (as now): efficient for 500,000 processes and more...
- Optimistic execution unfeasible because of our complex state
- Vision: realistic execution run optimistically only if it is safe to do so Determining independent actions is easy using formal methods

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# **Exhaustive Testing for Correctness Formal Assesment**

## Model Checking's Big Idea

- Explore all possible executions of the system
- Actively searching for property violations



# Testing can only prove the presence of bugs. — Dijsktra well, unless it's exhaustive :)

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# Model Checking in Wonderland

A warrior seeks her prince. She can grab i, grab i, move  $\rightarrow$ , move  $\leftarrow$ .





Model checking: Actively search for a counter example

- If not found, then the property was true after all
- If found, we got a counter-example (very precious during bug squashing)

Safety Property:  $\Box(\neg \bullet)$ 

- Search an invalidating state
- Exhaustive traversal: property true

Liveness Property:  $\Box((\searrow \land \heartsuit) \Rightarrow \diamondsuit \checkmark)$ 

- Search a cycle w/ property is false
- Counter-example is infinite

# The Problem with Model Checking

#### I use programs, not models

- $\blacktriangleright$  Model-checking usually done on logical models, e.g. expressed with TLA+
- Some technics require the full graph, that I never have
- $\Rightarrow\,$  Explicit exploration of Implicit graph is called Dynamic Verification

# Liveness Properties

- Nice properties are liveness ones, not safeties, but that's much harder
- Counter example must be of infinite length, so encoded as Buchi automaton



### State-space Explosion

- Nice problems require  $2^{2^{100}}$  years in practice (or more)
- Several reduction technics exists, but preserving cycles is harder

# **Dynamic Verification in SimGrid**

# Verifying safety properties

- ▶ It works (MSG & SMPI); Reduction with DPOR-based reduction techniques
- ► Found wild bugs in medium-sized programs (Chord protocol)

# Verifying liveness properties (ongoing)

- ▶ Problem: detect when the system reenters an (accepting) state
- We need system-level state equality



Martin Quinson Computational Science of Computer Systems Introduction CS<sup>2</sup> SimGrid PDES Formal Open Science Conclusion <a href="https://www.computational.com">Q2/30</a>

# **Challenges of System-level State Equality**

# Over provisioning



# Syntactic differences

▶ In malloc, blocs order can vary without impacting applicative semantic



### Padding Bytes

Data is aligned in memory for efficiency, leaving holes

#### Irrelevant differences

Host-related data (pid, files), simulation-related data (time)

# **Toward Liveness Properties in SimGrid**

# System Solutions to this Formal Problem

Problem	Heap solution	Stack solution
Over provisioning	Memset $0 + requested size$	Stack pointer
Padding bytes	Memset 0	DWARF + libunwind
Irrelevant differences	MC_ignore	DWARF + libunwind
Syntactic differences	Canonicalization	N/A

#### Current state

- ▶ Toy artificial bugs found; Toy property on non-tivial code (NeverJoin in Chord)
- State equality gives a new reduction that works on liveness, too

#### Future

- MPI3 asynchrone collective operations are a call for semantic bugs
- Assessing properties on communication schema toward easier checkpointing
- Assessing linearizability (service is robust to concurrent usages)
- Explore specific reduction techniques for distributed apps

# Take Away Messages

#### SimGrid will prove helpful to your research

- Versatile: Used in several communities (scheduling, GridRPC, HPC, P2P, Clouds)
- Accurate: Model limits known thanks to validation studies
- ► Sound: Easy to use, extensible, fast to execute, scalable to death, well tested
- Open: User-community much larger than contributors group; LGPL
- > Around since over 10 years, and ready for at least 10 more years

#### Welcome to the Age of (Sound) Computational Science



- Discover: http://simgrid.gforge.inria.fr/
- Learn: 101 tutorials, user manuals and examples
- Join: user mailing list, #simgrid on irc.debian.org
  We even have some open positions ;)

# The Computational Science Nightmare

### Computational Science is rarely Reproducible!

- ► Scientific publications must include all information needed for reproduction
- ▶ Knowledge is not the finding, but the method. Boyle

#### Issue shared with other scientific disciplines

- ▶ Why Most Published Research Findings are False. Ioannidis, PloS Med, 2005.
- ▶ Reproducibility in Computational and Experimental Maths workshop, 12/2012

JASA June	Computational Articles	Code Available
1996	9 of 20	0%
2006	33 of 35	9%
2009	32 of 32	16%
2011	29 of 29	21%



V. Stodden

#### Non-CS major will teach us about Computational Science!

(inspired from Victoria Stodden, Department of Statistics, Columbia University)

# **Open Science, and CS**<sup>2</sup>

#### **Required Tools**

- Standard tools: Matlab, R in statistics, ...
- Dissemination Platforms: RunMyCode.org
- Workflow Tracking and Research Environments: VisTrails, MyExperiment.org
- Embedded Publishing: Sweeve
- Journal Policy: Things evolve veeeery slowly

#### My Research Plan

- SimGrid is a standard tool; use it as troyan to pass best practices along
- Ease experiment packaging and sharing
- Increase associated tools (adaptative runners) to increase the incentive
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- Learn from other disciplines, and build upon this
## **Conclusion**

### Scientific Instruments for Distributed Systems

► Common Belief in 2008: Simulation as a toy methodology



Courtesy of Franck Cappello (Gri5000 keynote @ EGEE, Feb 2008 :)

# **Conclusion**

### Scientific Instruments for Distributed Systems

- ► Common Belief in 2008: Simulation as a toy methodology
- ► Consensus in 2013: SimGrid as a scientific instrument (w/ Grid'5000)



### Simulation turned into a reliable scientific instrument!

# **Conclusion**

### Scientific Instruments for Distributed Systems

- ► Common Belief in 2008: Simulation as a toy methodology
- Consensus in 2013: SimGrid as a scientific instrument (w/ Grid'5000)
- Consensus in 2020? We were naïve in 2010, but it works better now



## Simulation turned into a reliable scientific instrument! But there is still a long way to go!

# **Research Program**

# Computational Science of Computer Systems

pursued convergence of Simulation, Dynamic Verification and Emulation

## 1/ Modeling of Large-Scale Systems

- Scalability and Accuracy still not enough for Exascale studies
- Semantic modeling of MPI 3.0 collectives (implementation-depend)

## 2/ Formal Methods for Large-Scale and HPC Systems

- Liveness properties on legacy code (OS-level introspection tooling)
- Domain-specific properties and reduction techniques

## 3/ Simulation of Real Applications

- OS Virtualization layer for the simulation of legacy code
- Distributed simulation, and increase parallelism in our simulation

## 4/ Scientific Instrument and Open Science

- Produce a de facto standard tool, with associated tools
- ► Foster the emergence of a vivid research community, with best practices

# Question slides



### Modern Computers are Large and Complex

#### Massive Parallelism

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### Scientific Instrument

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SimGrid will prove helpful to your research

 Accurate: Model limits known thanks to validation studies Sound: Easy to use, extensible, fast to execute, scalable to death, well tested

· Open: User-community much larger than contributors group; LGPL

· Around since over 10 years, and ready for at least 10 more years



- PB 1: Enable this mode of MPI execution
- (partially) Reimplement MPI on top of SimGrid
- Enid MPI necesses as threads
- · Allow to manually factorize data memory

### PB 2: Useless if not realistic enough

- ► Improve model ~ piece-wise linear model
- Accurate also for small messages
- · Preserve good modeling of network contention

- Simulate 10<sup>6</sup> MPI Linpack processes within SimGrid?
- Distribute simulation to achieve this size-up

#### Push the validity limit further

- Validity is acceptable on simple examples
- Further improve the modeling of one-to-one communications
- Model global communications
- Model CPU and memory performance
- (OnenMPLys\_MPICH2) (with MESCAL team)

- Be the best alternative to simulate ExaScale Systems
- · ANR SONGS project coordinates these efforts (tool versatility considered helpful)

### SimGrid Scalability

### Simulation Versatility should not hinder Scalability

► Two aspects: Big enough (large platforms) ⊕ Fast enough (large workload)

#### Versatile yet Scalable Platform Descriptions

- Hierarchical organization in ASes ~ cuts down complexity ~ recursive routing
- Efficient on each classical structures Flat Flowd Star Coordinate-based
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### Visualizing SimGrid Simulations

- Visualization scriptable: easy but powerful configuration: Scalable tools
- Right Information: both platform and applicative visualizations
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- SMPI: simulate real annications written using MPI.

- MSG: User-friendly syntactic sugar
- Simix: Processes, synchronizations
- SURF: Resources usage interface
- Models: Compute completion dates

### Other Associated Tools

#### Workflow to any Experiments through Simulation

- 1. Prepare the experimental scenarios 2 Launch thousands of simulations
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Methodological framework and practical tools (+administrative duties



How big and how fast? (2/3 - P2P)

· Scenario: Initialize Chord, and simulate 1000 seconds of protocol

Arbitrary Time Limit: 12 hours (kill simulation afterward)

Max-Min Fairness Example





### The CPU model in a Nutshell

### Modeling computations in SimGrid

CPU - rate R in Mflop/s  $\oplus$  Computation - amount A of Flops  $\sim$  Time - A/R

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### Médiation scientifique

#### Sciences Manuelles du Numérique

- · Faire des activités d'initiation à la science informatique
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- Robozzle: Programmation (instruction, boucle, fonction)



# **Emulating Large-Scale Applications**

### Execute your application in a perfectly controlled environment

- Real platforms are not controllable, so how to achieve this?
- Let's look at what engineers do in other fields

### When you want to build a race car...



... adapted to wet tracks ... in a dry country ...





... you can simulate it.

### But then, you have

- To assess models
- Technical burden
- No real car

Why don't you...





just control the climate? or tweak the car's reality?

## **GRAS** (Grid Reality And Simulation)



### Develop Once, Deploy Twice

Develop and tune on the simulator; Deploy in situ without modification

## **GRAS** (Grid Reality And Simulation)



### Develop Once, Deploy Twice

 Develop and tune on the simulator; Deploy in situ without modification How: One API, two implementations

Grid Runtime Environment (result = application  $\neq$  prototype)

- Performance: efficient wire protocol for structured data
- ▶ Portable: across OSes, across CPU architectures, zero dependency

### But this forces an API to the users!

# Simulated MPI: Simulating real MPI applications

### Online simulation of unmodified MPI application within SimGrid

Algorithm prototyping; Platform dimensionning; What-if analysis ...



## PB 1: Enable this mode of MPI execution

- (partially) Reimplement MPI on top of SimGrid
- Fold MPI processes as threads
- Allow to manually factorize data memory

## PB 2: Useless if not realistic enough

- ► Improve model ~→ piece-wise linear model Accurate also for small messages
- Preserve good modeling of network contention

# **SMPI Future Work**

## Improve the enabling of MPI simulation

- Passes (almost) all MPICH tests
- $\blacktriangleright$  Privatization of variable still difficult  $\rightsquigarrow$  separate MPI processes
- Simulate 10<sup>6</sup> MPI Linpack processes within SimGrid?
- Distribute simulation to achieve this size-up

## Push the validity limit further

- Validity is acceptable on simple examples
- Further improve the modeling of one-to-one communications
- Model global communications
- Model CPU and memory performance

### (OpenMPI vs. MPICH2) (with MESCAL team)

### Vision

- Be the best alternative to simulate ExaScale Systems
- ANR SONGS project coordinates these efforts (tool versatility considered helpful)

# **Quick Overview of Internals Organization**

## User-visible SimGrid Components

- MSG: heuristics as Concurrent Sequential Processes (Java/Ruby/Lua bindings)
- SimDag: heuristics as DAG of (parallel) tasks
- SMPI: simulate real applications written using MPI

## SimGrid internal layers

- MSG: User-friendly syntactic sugar
- Simix: Processes, synchronizations
- ► SURF: Resources usage interface
- Models: Compute completion dates



# SimGrid Scalability

## Simulation Versatility should not hinder Scalability

▶ Two aspects: Big enough (large platforms)  $\oplus$  Fast enough (large workload)

## Versatile yet Scalable Platform Descriptions

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- Efficient on each classical structures
   Flat, Floyd, Star, Coordinate-based
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## Workload Generation



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## Max-Min Fairness between Network Flows



 $x_1 \leq Power\_CPU_1$  (1a)

$$x_2 + x_3 \leq Power_-CPU_2$$
 (1b)

$$\rho_1 + \rho_2 \leq Power\_link_1$$
 (1c)

$$\rho_1 + \rho_3 \leq Power\_link_2$$
 (1d)

### Computing the sharing between flows

- Objective function: maximize  $\min_{f \in \mathcal{F}} (\rho_f)$  [Massoulié & Roberts 2003]
- Equilibrium: increasing any  $\rho_f$  decreases a  $\rho'_f$  (with  $\rho_f > \rho'_f$ )
- (actually, that's a simplification of our real objective function)

### Efficient Algorithm

- 1. Search for the bottleneck link l so that:  $\frac{C_l}{n_l} = min\left\{\frac{C_k}{n_k}, k \in \mathcal{L}\right\}$
- 2. This determines any flow f on this link:  $\rho_f = \frac{C_f}{n_f}$
- 3. Update all  $n_l$  and  $C_l$  to remove these flows; Loop until all  $\rho_f$  are fixed

### Homogeneous Linear Network



$$C_1 = C n_1 = 2$$
  
 $C_2 = C n_2 = 2$   
 $\rho_0 = \rho_1 = \rho_2 = 0$ 

- All links have the same capacity C
- Each of them is limiting. Let's choose link 1

### Homogeneous Linear Network



$$C_{1} = C n_{1} = 2 
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  m ~and ~
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- Remove flows 0 and 1; Update links' capacity

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- $\Rightarrow 
  ho_0 = C/2 ext{ and } 
  ho_1 = C/2$
- Remove flows 0 and 1; Update links' capacity
- Link 2 sets  $\rho_1 = C/2$ .
- We are done computing the bandwidths  $\rho_i$

## Efficient Implementation

Lazy updates, Trace integration, preserving Cache locality

## Modeling computations in SimGrid

 $\mathsf{CPU} = \mathsf{rate} \ R \ \mathsf{in} \ \mathsf{Mflop/s} \oplus \mathsf{Computation} = \mathsf{amount} \ A \ \mathsf{of} \ \mathsf{Flops} \rightsquigarrow \mathsf{Time} = \mathsf{A}/\mathsf{R}$ 

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### Comparison to GridSim

A master distributes 500,000 fixed size jobs to 2,000 workers (round robin)

	GridSim	SimGrid
Network model	delay-based model	flow model
Topology	none	Grid5000
Time	1h	14s
Memory	4.4GB	165MB

## Volunteer Computing settings

- Loosely coupled scenario as in Boinc
- SimGrid: full modeling (clients and servers), precise network model
- SimBA: Servers only, descisions based on simplistic markov modeling
- $\rightsquigarrow$  SimGrid shown 25 times faster

# How big and how fast? (2/3 - P2P)

- ► Scenario: Initialize Chord, and simulate 1000 seconds of protocol
- Arbitrary Time Limit: 12 hours (kill simulation afterward)



- Orders of magnitude more scalable than state-of-the-art P2P simulators
- $\blacktriangleright$  Precise model incurs a  $\approx 20\%$  slowdown, but accuracy is not comparable
- ► Also, parallel simulation (faster simulation at scale); Distributed sim. ongoing

# How big and how fast? (3/3 - HPC)

### Simulating a binomial broadcast



Model:

- SimGrid: contention + cabinets hierarchy
- ► LogGOPSIM: simple delay-based model

### Results:

- SimGrid is roughly 75% slower
- SimGrid is about 20% more fat (15GB required for 2<sup>23</sup> processors)

The genericity of SimGrid data structures comes at the cost of a slight overhead BUT scalability does not necessarily comes at the price of realism

# Contributions to Experimental Facilities (in vivo)

## Grid'5000 Project: world leading scientific instrument for dist. apps

Instrument for research in computer science (*deployment* of customized OSes) 1500 nodes (2800 cpus, 7200 cores). 9 sites: dedicated 10Gb network







## Personal Contributions

- National steering committee; Local project co-leader (CPER, Aladdin, Hemera)
- Scientific animation, event co-organization: Nancy is a leading site
- ► Collaboration: Production grids (IdG), CEA, Arcelor-Mittal

Project: Experimentation Process Industrialization (with L. Nussbaum)

- ▶ Open science: ensure that experiments can be shared, reviewed, improved
- Convergence of simulation and direct execution
- Methodological framework and practical tools (+administrative duties)
## **One Methodology to Rule Them All**



Several scientific instruments implementing different scientific methodologies

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