## Computational Science of Distributed Systems

Martin Quinson (Université de Lorraine)

November 28, 2012

# Simulating Applications for Research in Simulation Applications for Research

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La simulation d'applications pour la recherche en applications de simulation pour la recherche

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Simulating Applications for Research in Simulation Applications for Research

Simulation Applications for Research

- Simulation is the third pillar of science (with theory and experiment)
- Computational Science = many simulations + big data
- Grids and HPC: parameter sweeps and simulations by scientists

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#### Simulating Application

- ► Assessing CS ideas through real experiments: long, difficult, bothersome
- Simulation makes it easy (but sometimes unsound)
- SimGrid is Versatile, Sound and Open



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#### Computational Science of Distributed Systems

- ► Large-Scale Infrastructures complexity ~> Scientific assessment
- All available methodologies must be combined





## **Research Context**

## Large Scale Distributed Systems

#### Scientific Objects

- Scientific Computing High Performance Computing Grids
- Peer-to-peer Systems Volunteer Computing Cloud Computing

Scientific Questions

## **Research Context**

Scientific Objects

#### Large Scale Distributed Systems

- Scientific Computing High Performance Computing Grids
- Peer-to-peer Systems
   Volunteer Computing
   Cloud Computing

#### Performance

- Time/Energy User/Provider
- Throughput/Makespan/#Msg
- Worst case/Avg/Amortized

#### Correction

- Safety: bad things don't happen
- Liveness: good things do happen



Context



# Scientific Questions

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#### Correction Study $\rightsquigarrow$ Formal Methods

► Tests: Unable to provide definitive answers

#### Performance Study $\rightsquigarrow$ Experimentation

Maths: Often not sufficient to fully understand these systems

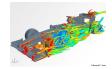
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	Experimental	Facilities:	Real applications on Real platform	(in vivo)
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Simulation: Prototypes of applications on system's <u>Models</u> (in silico)

#### Correction Study ~> Formal Methods

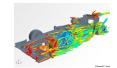
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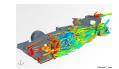
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Context

Simulation SimGrid HPS Formal Emulation Conclusion

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## Simulation? Theory is enough for Artificial Artifacts!

#### Computers contain only what we've put in!

Modern computer systems present an unpreceded complexity

- Heterogeneous components, Dynamic and Complex platforms
- Numerous: milions of cores expected within the decade (ExaScale)
- $\blacktriangleright$  Large: kernel+jvm+tomcat  $\rightsquigarrow$  50M lines (25 times Encyclopedia Britanica)

#### Toward a Computational Science of Distributed Computer Systems

- ► Empirically consider Distributed Systems as "Natural" Objects
- Other sciences routinely use computers to understand complex systems

#### Claim: simulation is both sound and convenient

- Less simplistic than proposed theoretical models
- Easier and faster than experimental platforms
- It should be part of your methodology

# **Simulating Distributed Systems**



#### Comfort to the user

- Get preliminary results from partial implementations
- Experimental campaign with thousands of runs within the week
- Test your scientific idea, don't fiddle with technical subtleties (yet)

## Challenges for the tools

- Validity: Get realistic results (controlled experimental bias)
- Scalability: Simulate fast enough problems big enough
- Associated tools: campaign mgmt, result analysis, settings generation, ...
- Applicability: If it doesn't simulate what is important to the user, it's void

#### Requirements for a Scientific Approach

- ► Reproducible results: read a paper, reproduce the results and improve
- Standard tools that Grad students can learn quickly

#### Current practice in the field is quite different

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

	Domain	CPU	Disk	Network	Application	Scale
OptorSim	(Data)Grid	Analytic	Amount.	(buggy) Analytic	Programmatic	1,000
GridSim	Grid	Analytic	Analytic	(buggy) wormhole	Programmatic	1,000
CloudSim	Cloud	Analytic		(buggy) Analytic		
OverSim	P2P	None	None	Euclidian or Pkt-Ivl	Programmatic	100,000
PeerSim	P2P	None	None	Constant time	State machine	1,000,000
SimGrid	Grid, VC, P2P,	Analytic	tic Amount	Flow, Cste-time or	Program, Trace	1,000,000
Simonu	HPC, cloud,	Analytic		Packet-level (NS3)	or Emulation	

# SimGrid Framework

## Scientific Instrument

- Versatile: Grid, P2P, HPC, Volunteer Computing and others
- Sound: Validated, Scalable, Usable; Modular; Portable
- Open: Grounded +100 papers; 100 members on simgrid-user@; LGPL

## Scientific Object (and lab)

Workbench for Network Models: Model-Checker: soon Emulator

## Scientific Project since 12 years

- Collaboration Loria / Inria Rhône-Alpes / CC-IN2P3 / U. Hawaii
- Fundings INRIA; ANR: USS SimGrid (08-11), SONGS (12-16)

#### Coming next: SimGrid as a Reliable Scientific Instrument

- High-Performance Simulation for Computer Science
- Formal analysis and Dynamic verification of real applications
- Unified experimental workbench of real applications

## SimGrid Scalability (Grids and Volunter Computing)

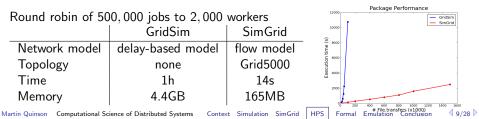
#### Simulation Versatility should not hinder Scalability

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

## How Big?

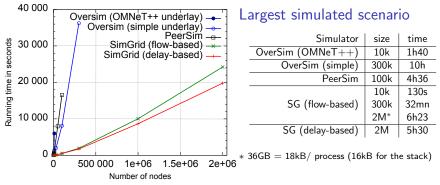
P2P	2,500 peers with Vivaldi coordinates	294KB
VC	5120 volunteers	435KB + 90MB
Grid	Grid5000: 10 sites, 40 clusters, 1500 nodes	22KB
HPC	1 cluster of 262144 nodes	5KB
HPC	Hierarchy of 4096 clusters of 64 nodes	27MB
Cloud	3 small data centers $+$ Vivaldi	10KB

#### How Fast?



## SimGrid Scalability (Peer-to-Peer)

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



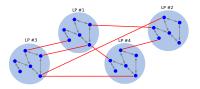
- Orders of magnitude more scalable than state-of-the-art P2P simulators
- $\blacktriangleright$  Precise model incurs a  $\approx 20\%$  slowdown, but accuracy is not comparable
- Next: Can parallel simulation be faster?

## 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

- Parallel implementation of PeerSim/DES (not by PeerSim main authors)
- Classical parallelization: spreads the load over several Logical Processes (LP)



#### **Evaluation**

- $\blacktriangleright$  Uses Chord as a standard workload: e.g. 320,000 nodes  $\sim$  320,000 requests
- Very good speedup results: 4h10 on 2 LPs, only 1h06 using 16 LPs
- But 47s in the original sequential PeerSim (and 5s in precise SimGrid)
- Yet, best previously known parallelization of DES simulator of P2P systems

## New Parallelization Schema for DES

#### Classical Understanding of Parallel DES

Simulation Workload	<ul> <li>Granularity, Communication Pattern</li> <li>Events population, probability &amp; delay</li> <li>#simulation objects, #processors</li> </ul>	
Simulation Engine	<ul> <li>Parallel protocol, if any:</li> <li>Conservative (lookahead,)</li> <li>Optimistic (state save &amp; restore,)</li> <li>Event list mgnt, Timing model</li> </ul>	
Execution Environment	<ul> <li>OS, Programming Language (C, Java), Networking Interface (MPI,)</li> <li>Hardware aspects (CPU, mem., net)</li> </ul>	

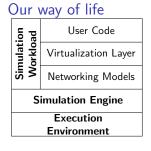
#### Our models are hard to parallelize

- ► Full linear programs instead of static queues; Evt completion date changes
- They are overly optimized (Cache oblivious, lazy updates)

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#### Our models are hard to parallelize

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#### That's not the problem anyway

Performance killer is simulated application itself, not event handling

## Toward Parallel P2P Simulation in SimGrid

## Overall Goal

- Parallelization for speed. Multithreaded on shared memory
- $\triangleright$  P2P = worst case (fine grain  $\rightsquigarrow$  cannot hide issues with app-level parallelism)
- Actually, P2P may not need this but if we succeed here, it works everywhere

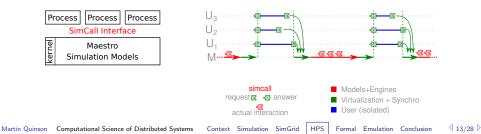
## OS-inspired Approach

- ▶ Keep models sequential, parallelize the workload: execute processes in parallel
- Processes separation through a OS-oriented approach: simcalls



**Functional View** 

## Temporal View



# **Efficient Parallel Simulation**

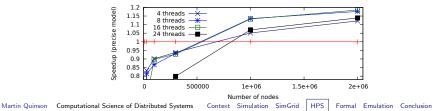
## Leveraging Multicores

▶ More processes than cores ~→ Worker Threads (execute co-routines ;)



## Reducing Synchronization Costs

- syscalls toward synchronization are the performance killer to optimize
- Assembly reimplementation of ucontext: no syscall on context switch
- Synchronize only at scheduling round boundaries using futexes
- Dynamic load distribution: hardware fetch-and-add next process' index



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#### Correction Study ~> Formal Methods

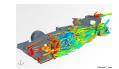
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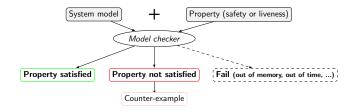
Formal Emulation Conclusion

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## **Formal Algorithm Verification**

## Model-Checking

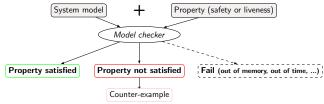
- > Automatically checks whether a given model of a system satisfies a property
- Gives a counter-example in case of violation of the property



# Formal Algorithm Verification

## Model-Checking

- Automatically checks whether a given model of a system satisfies a property
- Gives a counter-example in case of violation of the property



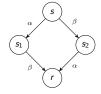
## **Safety** property

- "Bad things do not append during the execution"
- Assertion on reachabled states

#### **Liveness** property

- "Good things will eventually happen in all cases"
- Verification on an execution path
- Temporal logic formula (LTL, CTL, ...)

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Formal

Emulation Conclusion

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# The Problem with Model-Checking

#### I use programs, not models

- Model-checking usually done on logical models, e.g. expressed with TLA<sup>+</sup>
- Some technics require the full graph, that I never have

## 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





- r: request
- cs: critical section
- ▶ LTL property:  $\Box$ ( $r \Rightarrow \Diamond cs$ ) "Any process that asks the critical section must obtain it"

## State-space Explosion

- Nice problems are not feasible in practice in less than  $2^{2^{100}}$  vears
- Several reduction technics exists, but often not for liveness properties

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Formal

Emulation Conclusion

# **Dynamic Verification in SimGrid**

#### Current state

- Can verify safeties on unmodified programs (model explored implicitely)
- DPOR-based reduction technique integrated
- ► Found wild bugs in medium-sized programs (Chord protocol)

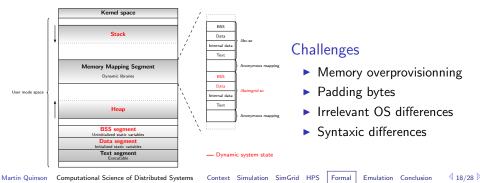
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#### Ongoing work: toward liveness properties

▶ Problem: detect when the system reenters an (accepting) state

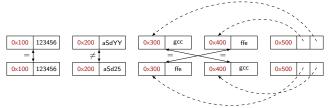


## **Challenges of System-level State Equality**

Overprovisionning



- Padding bytes
- Irrelevant differences about simulation
- Syntactic differences



## **Toward Liveness Properties in SimGrid**

## System Solutions to this Formal Problem

Problem	Heap solution	Stack solution
Overprovisionning	Memset 0 +	Stack pointer
	requested size	
Padding bytes	Memset 0	DWARF + Libunwind
Irrelevant OS differences	MC_ignore	DWARF + libunwind +
		MC_ignore
Syntactic differences	Canonicalization	N/A

#### Preliminary results

- Toy artificial bugs found; Toy property on non-tivial code (NeverJoin in Chord)
- State equality gives a new reduction that works on liveness, too
- Difficulty: we are also model-checking SimGrid; hidden bugs strike back

#### **Future**

- MPI3 asynchrone collective operations are a call for semantic bugs
- Assessing properties on communication schema toward easier checkpointing

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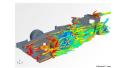
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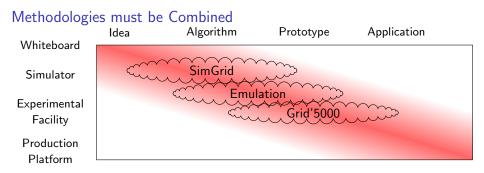
Conclusion

## No Experimental Methodology is Sufficient

# Methodologies must be Combined Idea Algorithm Prototype Application Whiteboard Simulator Experimental Facility Production Platform Production

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# No Experimental Methodology is Sufficient



#### One Workbench to Rule Them All

- Share XP description, DoE and visualization tools
- Dream: seamlessly switch to the most adapted tool
- Ambitious goal, but science is a team game, isn't it?

Coming next: bridging the gap between simulation and real world

Emulation

# **Emulation as an Experimental Methodology**

#### Execute real application in a perfectly controlled environment

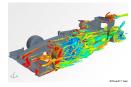
- Real platforms are not controllable, so how to achieve this?
- Let's look at what engineers do in other fields

#### 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?

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Conclusion

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## Simulated MPI: Simulating real applications

#### Online simulation of unmodified MPI application within SimGrid

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



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## 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

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## 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 toy examples
- Improve the modeling of one-to-one communications
- Model global communications
- Model CPU and memory performance

## Vision

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

Emulation Conclusion



(OpenMPI vs. MPICH2) (with MESCAL team)

## How to Emulate Any Application?

#### Limits of existing approaches

- SMPI is obviously limited to MPI applications (J2EE?)
- Emulation through degradation only reduces the host platform

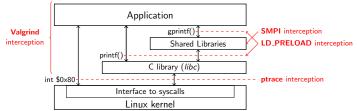
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- LD\_PRELOAD: Dynamic loader tricks; ptrace: syscall trapping

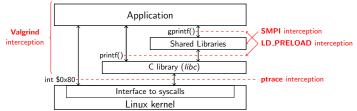
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#### Current State of simterpose

Working POC on top of SimGrid, but student code quality for now

## 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

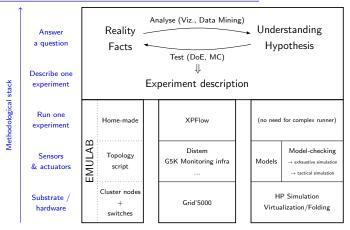
#### Welcome to the Age of (Sound) Computational Science



- 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 ;)

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## One Methodology to Rule Them All



Several scientific instruments implementing different scientific methodologies

#### Conclusions

- There is no alternative to Computational Science of Distributed Systems
- Science is Team Game: I have elements, but need a (full) team support

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