# Mc SimGrid

### Turning a Simulator of System Performance into a Dynamic Verification Framework

Martin Quinson ENS Rennes / Inria, France



Northeastern University January 23., 2018

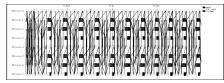
### Modern Large Scale Distributed Systems

#### Huge Systems

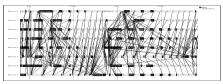


#1 Taihu Light 10,649,600 cores 125 Tflops, 15MW #2 Tianhe 2 3,120,000 cores 56 Tflops, 18MW #3 Piz Daint 361,760 cores 25 Tflops, 2MW

#### **Complex Applications**



Rigid, Regular, Hand-tuned Comm Patterns



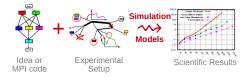
Dynamic, Irregular (task-based?)

How do we study these beasts?

# Simulating Distributed Systems

#### Simulation: Fastest Path from Idea to Data

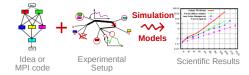
> Test your scientific idea with a fast and confortable scientific instrument



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▶ Test your scientific idea with a fast and confortable scientific instrument



Simulation: Easiest Way to Study Real Distributed Systems

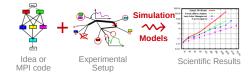


- > Centralized and reproducible setup. Don't waste resources to debug and test
- ► No Heisenbug, full Clairevoyance, High Reproducibility, *What if* studies

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#### Simulation: Easiest Way to Study Real Distributed Systems



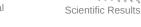
- Centralized and reproducible setup. Don't waste resources to debug and test
- ▶ No Heisenbug, full Clairevoyance, High Reproducibility, What if studies
- Also software/hardware co-design, capacity planning or hardware qualification

### Methodological Challenges raised

- -

Idea or MPI code

Experimental Setup



Simulation

Models

### Challenges

- ► Validity: Realistic results
- Scalability: Fast enough; Big enough
- ► Right Focus: Aligned with users concerns

### Flourishing State of the Art

- Each group / student build its own tool
  - Short lived, Narow focus, Improvable
- Some very good domain-specific tools (HPC)

# SimGrid: Versatile Simulator of Distributed Apps

### Install a Scientific Instrument on your Laptop

- Joint Project since 1998, mostly from french institutions
- Open Project, contributors in the USA (UHawaii, ISI), UK, Austria, Cern

### Key Strengths

- ▶ Performance Models validated with Open Science ~> Predictive Power
- ► Architectured as an OS ~> Efficiency; Performance & Correction co-evaluation
- Versatility: Advances in Clouds modeling reused by DataGrid users
- Usability: Fast, Reliable, MPI API, Visualization

### Community

- Mostly Scientists: 150 publications by 120 individuals
- Apps/Model co-dev : StarPU, BigDFT, TomP2P
- Some industrial users on internal projects (Intel, ...)
- Open Source: external Power Users (fixes & models) ►







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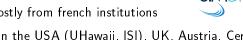
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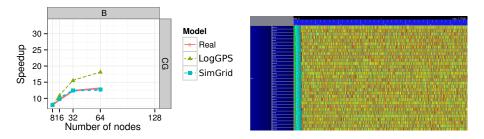
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### Validity Success Stories

unmodified NAS CG on a TCP/Ethernet cluster (Grid'5000)

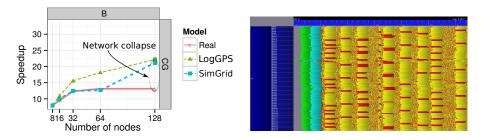


#### Key aspects to obtain this result

- ▶ Network Topology: Contention (large msg) and Synchronization (small msg)
- > Applicative (collective) operations (stolen from real implementations)
- Instantiate Platform models (matching effects, not docs)
- All included in SimGrid but the instantiation (remains manual for now)

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#### Discrepency between Simulation and Real Experiment. Why?

- Massive switch packet drops lead to 200ms timeouts in TCP!
- Tightly coupled: the whole application hangs until timeout
- ► Noise easy to model in the simulator, but useless for that very study
- > Our prediction performance is more interesting to detect the real issue

#### What is the Perfect Model anyway?

- Detailed enough to be realistic
- Efficient enough for ultra fast simulations
- Abstracted enough so that I can reason about
- ▶ In short, that's the one I could give to my students and forget about



### Maps (and models) are abstractions

- Quality depends on what your usage
- ► More detailled ≠ better (not always)
- No One True Map fitting all needs
- Myriads of carefully adapted maps







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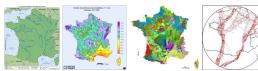




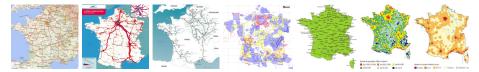


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# Perfect Model of Distributed Systems?

### the one making your Study sound

### If you study a theoretical P2P algorithm

► You could probably go for a super-fast constant-time model

### If your study is a MPI application

- ▶ with TCP LAN, SMPI should do the trick (with correct instanciatiation)
- ▶ with InfiniBand and/or GPUs, you need our still ongoing models

#### If you work on a TCP variant

then you need a packet-level simulator such as NS3

#### If your study WAN-interconnected Set Top Boxes

- SMPI model not suited! Impossible to instanciate, validated only for MPI
- Vivaldi model intended for that kind of studies

### In any case, assess the validity & soundness

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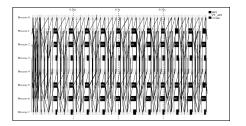


# Writting Correct Distributed Applications

- Classical Solution: Proof of algorithms
- Pessimistic Solution: Lower performance expectations
- Optimistic Solution: Eventually Consistent



► HPC Solution: Rigid, Regular, Hand-tuned Communication Patterns

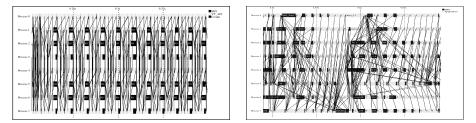


# Writting Correct Distributed Applications

- Classical Solution: Proof of algorithms
- Pessimistic Solution: Lower performance expectations
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- ► HPC Solution: Rigid, Regular, Hand-tuned Communication Patterns
- Large-Scale Hybrid Machines: Dynamic, Irregular (task-based?)



Verification: must explore all possible execution paths

# Virtualizing MPI Applications with SimGrid

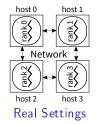


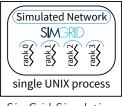
#### SMPI: Reimplementation of MPI on top of MPI

- Computations emulated; Communications simulated
- Complex C/C++/F77/F90 apps run out of the box
- MPI 2.2 partially covered ( $\approx$  160 primitives supported)
  - ▶ No MPI-IO, MPI3 collectives, spawning ranks, ...
  - Monothreaded applications, no pthread nor OpenMP

### MPI Applications are *folded into* a single process







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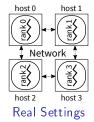


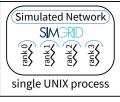
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SimGrid Simulation

#### McSimGrid builds upon SimGrid to verify MPI applications

# Formal Methods in Mc SimGrid



### Model Checking

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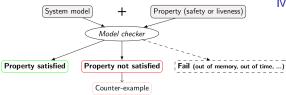
Dynamic Verification: similar idea, applied to source code

- McSimGrid: Live, virtualized execution No static analysis (yet), no symbolic execution
- ► On Indecision Points: checkpoint, explore, rollback





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#### Execution Model in McSimGrid

- Mono-threaded MPI applications (CSP)
- Point-to-Point semantic: Configurable (paranoid / permissive)
- Collective semantic: Implementations of MPICH3, OpenMPI





### Use Cases: Kind of Properties

#### Safety Properties: "A given bad behavior never occurs"

- e.g.: any assertion (x != 0, no deadlock)
- Verified on each state separately
- Counter example: a faulty state

Liveness Properties: "An expected behavior will happen in all cases"

- ▶ e.g.: Any request will eventually be fulfilled; No non-progression cycle
- Verified on a full execution path
- ► Counter example: a cycling execution path that violates the property

#### Comm Patterns: "It exists a pattern that is the same for all exec paths"

- e.g.: send-deterministic (local sending order is always the same)
- Work on all execution paths
- Counter examples: two paths exhibiting differing communication patterns

# Mitigating the State Space Explosion

#### The exploration process often fails to complete

- ► Too many states to explore, not enough time and/or memory
- Mc SimGrid provides two reductions techniques

Dynamic Partial Ordering Reduction (DPOR)

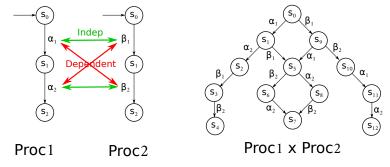
- Avoid re-exploring equivalent interleavings
- > Don't explore all interleavings of local executions: they are equivalent

System-Level State Equality

Detect when a given state was previously explored

# Partial Ordering Reduction (DPOR)

Avoid re-exploring Mazurkiewicz traces (don't permute independent events)



- McSimGrid: iSend and iSend are independent, etc.
- > Dynamic Partial Ordering Reductions take advantage of runtime knowledge
- Many techniques (sleep sets, ample sets) are hard to understand & get right
- Ongoing work: reimplement our DPOR using Event Unfolding Structures

### But what are the transitions in Mc SimGrid?

Transition = atomic block of code between Indecision Points

- ▶ Test all interleavings of the shared state (mem+network) modifications
- Transition = (some local code +) one shared state's change

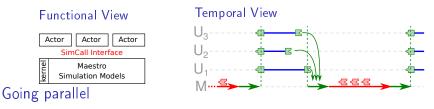
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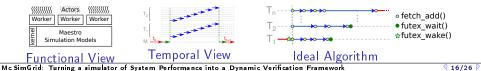
- ► Test all interleavings of the shared state (mem+network) modifications
- ► Transition = (some local code +) **one** shared state's change

Implementation: SimGrid is an Operating System

- Actors must use simcalls to modify the shared state
- ► First introduced for parallel simulation, but crucial to dynamic verification



• More actors than cores  $\sim$  Worker Threads that execute co-routines



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#### System-Level State Equality

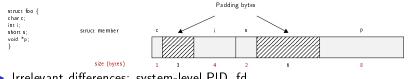
- Detect when a given state was previously explored
- Introspect the application state similarly to gdb
- Also with Memory Compaction

# **OS-level State Equality Detection**

#### Memory over-provisioning



Padding bytes: Data structure alignment



- Irrelevant differences: system-level PID, fd, ....
- Syntactic differences / semantic equalities: Solutions

lssue	Heap solution	Stack solution		
Overprovisioning	<pre>memset 0 (customized mmalloc)</pre>	Stack pointer detection		
Padding bytes	<pre>memset 0 (customized mmalloc)</pre>	DWARF + libunwind		
Irrelevant differences	Ignore explicit areas	DWARF + libunwind + ignore		
Syntactic differences	Heuristic for semantic comparison	N/A (sequential access)		

Mc SimGrid: Turning a simulator of System Performance into a Dynamic Verification Framework

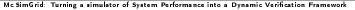
### Applicative State in Mc SimGrid

#### We work at system level

- Target = legacy MPI apps
- Stack: where maestro lives
- ► Heap: shared between actors + actors stacks
- BSS+Data: private copy for each actor
- Network state is within libsimgrid data

#### How to privatize the BSS+data

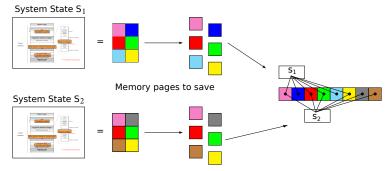
- (this is required to fold MPI processes anyway)
- Source-to-Source: turn globals into arrays of locals
- Compiler's pass: move globals into TLS area changes toolchain (no icc) → alters SEBs (as any previous solution)
- GOT injection: rewrite the ELF symbol table when switching contextes static variables are not part of the GOT unfortunately
- mmap of bss+data segments: preserves SEBs but forces sequential exec
- dlopen tricks: compile app with -fPIE, dlopen() it many times





### **Memory Compactions**

#### We save literally thousands of states



- Very few modification between states in practice
- First fast hash function to distinguish new pages, then byte-wise equality
- Combines nicely with State Equality Detection (but complex implementation)

### **Evaluation**

### Verified small applications

- ► MPI2 collectives, MPICH3 test suite, Benchmarks (NAS, CORAL, NERSC)
- Safety, Liveness (no non-progressive cycle), Send-determinism

#### Results

- ▶ Without reduction, only scales up to 2 to 6 processes in 24h
- ▶ Reductions (when usable) and Memory Compaction goes a bit further
- Not exactly ExaScale, but exhaustively at small size already useful

#### Found bugs

- The one we intentionally added to the code
- Our own implementation of the Chord protocol (not in MPI)
- But no wild bugs in MPI yet :(

### Verification of some MPICH3 unit tests

- ► Looking for assertion failures, deadlocks and non-progressive cycles
- Exhaustive exploration, but no error found
- ightarrow pprox 1300 LOCs (per test) State snapshot size: pprox 4MB

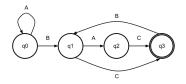
Application	#P	Stateless exploration		Stateful exploration		
		# States	Time	# States	Time	Memory
sendrecv2	2	> 55 millions	> 6h	936	13s	2GB
	5	-	-	2 284	43s	5.4GB
	10	-	-	3 882	2m	11GB
bcastzerotype	5	> 12 millions	> 1h	2 474	41s	3.1GB
	6	-	-	17 525	5m	19GB
coll4	4	> 100 millions	> 24h	29 973	20m	38GB
	5	-	-	> 150  000	> 4h	> 200GB
groupcreate	5	> 10 millions	> 1h30	2 217	38s	2.8GB
	7	-	-	71 280	24m	62GB
dup	4	> 57 millions	> 5h	4 827	1m20	6.5GB
	5	-	-	75 570	49m	87GB

▶ We verified several MPI2 collectives too: all good so far 🙁

# **Checking Liveness Properties**

#### Enforce property $\phi$

- $\blacktriangleright$  Search for a counter-example, ie a run of the system satisfying  $\neg\phi$
- $\blacktriangleright$  Counter examples are infinite  $\rightsquigarrow$  Build the Büchi Automaton of  $\neg\phi$



- Ensure that Application  $\times$  Bucchi( $\neg \phi$ ) is empty (no accepted run)
- State Equality is crucial to detect cycles

#### Current state in Mc SimGrid

- ▶ Working in our tests (although fragile: equality is based on heuristics)
- ▶ We are looking for more domain-specific interesting properties

# Verification of Protocol-wide Properties

#### Motivation

- Clever checkpoint algorithms exist, provided that the application is nice enough
- On communication determinism in parallel HPC applications,
  - F. Cappello, A. Guermouche and M. Snir (2010)
    - Manual inspection of 27 HPC applications, seeking for such properties

#### Protocol-wide properties

- deterministic: On each node, send and receive events are always in same order
- ▶ send deterministic: ∀ node, send are always the same, no matter the recv order
- ► Not liveness, not even LTL: quantifies for all execution paths within property

#### Status report: we can verify such properties in Mc SimGrid

- > Explore one path to learn the communication order, deduce the property
- Enforce that this order holds on all other execution path
- ► We reproduced the conclusions of previous paper on several benchmarks
  - NAS Parallel Benchmarks NPB 3.3 (5 kernels)
  - CORAL Benchmark codes
  - NERSC-8/Trinity Benchmarks\* Conclusion

# Conclusion on Mc SimGrid

#### Mc SimGrid: Dynamic Verification of MPI applications

- ► Unmodified C/C++/Fortran MPI applications
- ► Early stage, but already functional: Safety, Liveness, Send-determinism
- Reductions: DPOR and State Equality
- Scale to a few processes only, but exhaustive testing

### State of the Art

- ▶ Many testing tools (MUST): not exhaustive nor sound
- Symbolic execution (TASS, CIVL): complementary to our work
- Dynamic verification (ISP, DAMPI at U. Utah)
  - PMPI proxy at runtime to delay communications to guide execution
  - Works for safety, but not applicable to liveness (state equality)

### Ongoing Works

- Improve DPOR by using Event Unfolding structures
- ► Collab with NEU: Convert checkpoints taken on MPICH into SimGrid runs

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