Introduction	Definition		Challenges	Conclusion
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Computational Challenges in Relativistic Cosmology

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July 4th, 2017

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Inhomogeneous Cosmologies - Vincent Reverdy - Torun, Poland - July 2017

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Classical Numerical Cosmology

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The local U	niverse			





Inhomogeneous Cosmologies - Vincent Reverdy - Torun, Poland - July 2017





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Integration of	of geodesics			





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Results				

2000 1500 *d_A* (in Mpc) 0001 Results • Homogeneous $\Lambda \in$ inhomogeneous RP at 1σ A less structured model is interpreted as more ACDM (reference) 500 ACDM structured when inhomogeneities are not taken into WCDM (reference) account WCDM Important effects when interpreting data **RPCDM** (reference) RPCDM 1 2 3 n Redshift z

Homogeneous and inhomogeneous angular diameter distances

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Defining Numerical Relativistic Cosmology

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Where do we	want to go?	Defining the ideal sime	ulation	
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	Definition		Challenges	Conclusion

Let's imagine we have a yottascale (10^{24}) supercomputer: 1 billion times more powerful than today with 1 billion times more memory than today

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Where do we want to go? Defining the ideal simulation

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What?

- Full GR: no background whatsoever
- Cosmological structure formation

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What size range?

- L_{min}: small galaxies?
- *L*_{max}: the Observable Universe?

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Where do we want to go? Defining the ideal simulation

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- t_{end}: current epoch?

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What physics?

- Pure gravity
- Hydrodynamics?
- Baryonic physics?
- Singularities and black holes?

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- Neutrinos?
- Magnetic fields?
- Pre-CMB physics?
- etc. . .

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Why?				

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Why?			

Compute the order of magnitude of the backreaction?

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	Definition	Challenges	Conclusion
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Why?			

- Compute the order of magnitude of the backreaction?
- Answer the backreaction conjecture?

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	Definition	Challenges	Conclusion
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Why?			

- Compute the order of magnitude of the backreaction?
- Answer the backreaction conjecture?
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Introduction	Definition	Challenges	Conclusion
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- Have better virtual catalogs to prepare observational surveys?

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Why?			

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- Numerical demonstration of classical cosmology?

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- Numerical demonstration of classical cosmology?
- Understand the emergence of physics phenomena?

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Introduction	Definition	Challenges	Conclusion
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Why?			

- Compute the order of magnitude of the backreaction?
- Answer the backreaction conjecture?
- Have more realistic simulations?
- Have better virtual catalogs to prepare observational surveys?
- Better accuracy and precision in cosmological predictions?
- Numerical demonstration of classical cosmology?
- Understand the emergence of physics phenomena?
- Anything else?

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Why more power	?			

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Why more power?	?		

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Why more power?)			

More stuff: bigger, longer, larger

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	Definition		Challenges	Conclusion
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Why more power?	?			

- More stuff: bigger, longer, larger
- More resolution: in space, in time, in mass

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Will this really answer our questions?

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Will this really answer our questions?

• More stuff \Rightarrow better evaluation of global quantities

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- \blacksquare More stuff \Rightarrow better evaluation of global quantities
- $\blacksquare More resolution \Rightarrow less numerical errors$

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- More resolution ⇒ less numerical errors
- \blacksquare More simulations \Rightarrow better accuracy on statistical quantities
- More physics \Rightarrow more realistic (but less understanding)

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	Definition	Challenges	Conclusion
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Traditional answers: the philosophy of more

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- More resolution: in space, in time, in mass
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- More simulations \Rightarrow better accuracy on statistical quantities
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Does not really bring any new knowledge...

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On realistic simi	ulations			

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On realistic	simulations			
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	Definition		Challenges	Conclusion

- Increase the number of degrees of freedom
- Increased degeneracy
- Add dimensions in a parameter space with local extrema

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On realistic simulations				
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	Definition		Challenges	Conclusion

- Increase the number of degrees of freedom
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Reality vs correctness

- Mimicking reality does not provide any guarantee of correctness
- Proving correctness is difficult, and even more with multiphysics simulations
- Multiphysics increase confusion instead of explainability

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The role of simulations

- The goal of simulations is not to produce realistic results
- Producing realistic results is an optimization problem
- Neural networks can do it far better and way faster than most physical models

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On realistic simulations				
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(Personal) conclusion

Simulations are not about the result, they are about the process

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Less is more				

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	Definition		Challenges	Conclusion
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Less is more				

- More stuff
- More resolution
- More simulations
- More physics

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Less is more				

- More stuff
- More resolution
- More simulations
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The philosophy of less

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Less is more				

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The philosophy of less

"Less" physics: start from more fundamental equations

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Less is more				

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- More resolution
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The philosophy of less

- "Less" physics: start from more fundamental equations
- Less approximations

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Less is more				

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The philosophy of less

- "Less" physics: start from more fundamental equations
- Less approximations
- Lower the number of degrees of freedom

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Less is more				

- More stuff
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The philosophy of less

- "Less" physics: start from more fundamental equations
- Less approximations
- Lower the number of degrees of freedom
- Improved correctness

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The philosophy of less

- "Less" physics: start from more fundamental equations
- Less approximations
- Lower the number of degrees of freedom
- Improved correctness
- More generic

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Less is more				

- More stuff
- More resolution
- More simulations
- More physics

The philosophy of less

- "Less" physics: start from more fundamental equations
- Less approximations
- Lower the number of degrees of freedom
- Improved correctness
- More generic
- Understanding emergence

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	Definition	Limitations	Challenges	Conclusion
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Current Limitations in Numerical Relativistic Cosmology

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What do we	have? What do	we need?		

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What do we	have? What do	we need?		

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	Definition	Limitations	Challenges	Conclusion
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What do we have	e? What do we ne	eed?		

• The fundamental physics is known: $G_{\mu\nu} = \frac{8\pi G}{c^4} T_{\mu\nu}$

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- The numerical methods are known

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	Definition	Limitations	Challenges	Conclusion
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- The algorithms are known

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- The numerical methods are known
- The algorithms are known
- Parallelization techniques are known

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- Implementation is a technical detail

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What we do need

 \Rightarrow Therefore it is a problem of computational power

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Computational p	ower			

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Computational po	ower			

Present and future

- We already have petascale supercomputers (10^{15} FLOPS)
- Exascale supercomputers are coming (10¹⁸ FLOPS)

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	Definition	Limitations	Challenges	Conclusion
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Computatio	nal power			

Present and future

- We already have petascale supercomputers (10¹⁵ FLOPS)
- Exascale supercomputers are coming (10¹⁸ FLOPS)

A lot of room at the bottom

- A lot of time in current simulation codes is spend doing nothing
- Lot of opportunity for optimizations at the bottom of computing
- Computer science, computer architecture, compiler, programming languages

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Applications				
	High leve	l libraries		
Wrappers and bindings Python R Java				
Optimized libraries	Interpreters	Python, R)	Virtual machines (JVM)	
Compile	d, native, low lev	vel languages (C	, C++)	
Compilers, mostly written in C and C++ (GCC, LLVM)				
M	Machine layer, assembly instructions			

Propagation of optimizations

Softwares are built as stacks. Low-level optimizations can be propagated back to the higher levels while ensuring maximum performances and genericity.

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Benchmark of standard algorithms on vector
bool> vs their bit_iterator specialization (logarithmic scale) [preliminary results]

i7-2630QM @ 2.00GHz, Linux 3.13.0-74-generic, g++ 5.3.0, -O3, -march=native, stdlibc++ 20151204, credit: Vincent Reverdy



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Benchmark of standard algorithms on vector<bool> vs their bit_iterator specialization (linear scale) [preliminary results]

Average time for 100 benchmarks with a vector size of 100.000.000 bits (speedups are provided at the top of each column)

i7-2630QM @ 2.00GHz, Linux 3.13.0-74-generic, g++ 5.3.0, -O3, -march=native, stdlibc++ 20151204, credit: Vincent Reverdy $1906 \times$ $461 \times$ $334 \times$ $31 \times$ $389 \times$ $3359 \times$ $300 \times$



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Challenges in Numerical Relativistic Cosmology

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Upcoming chal	lenge: data stri	uctures		

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Upcoming challenge: data structures

DATA TRANSFER TIMINGS (CREDITS: GOOGLE RESEARCH)				
Operation	Approx. time	Remark		
L1 cache reference	0.5 ns			
One cycle on a 3 GHz processor	1 ns			
Branch mispredict	5 ns			
L2 cache reference	7 ns	$14 \times L1$ cache		
Mutex lock or unlock	25 ns			
Main memory reference	100 ns	$200 \times L1$ cache		
Send 1 KB over a 1 Gbps network	$10\mu s$			
Read 1 MB sequentially from main memory	$250 \mu s$			
Round trip within the same datacenter	$500 \mu s$			
Read 1 MB sequentially from a SSD	1 ms	4× memory		
Disk seek	10 ms	$20 \times datacenter RT$		
Read 1 MB sequentially from disk	20 ms	$80 \times$ memory		
${\sf Send} \ {\sf packet} \ {\sf California} {\rightarrow} {\sf Netherlands} {\rightarrow} {\sf California}$	150 ms			

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Upcoming challenge: data structures

Data transfer timings (Credits: Google Research)				
Operation	Approx. time	Remark		
L1 cache reference	0.5 ns			
One cycle on a 3 GHz processor	1 ns			
Branch mispredict	5 ns			
L2 cache reference	7 ns	$14 \times L1$ cache		
Mutex lock or unlock	25 ns			
Main memory reference	100 ns	$200 \times L1$ cache		
Send 1 KB over a 1 Gbps network	$10 \mu s$			
Read 1 MB sequentially from main memory	250 μs			
Round trip within the same datacenter	500 μs			
Read 1MB sequentially from a SSD	1 ms	4× memory		
Disk seek	10 ms	20 imes datacenter RT		
Read 1 MB sequentially from disk	20 ms	$80 \times$ memory		
${\sf Send} \ {\sf packet} \ {\sf California} {\rightarrow} {\sf Netherlands} {\rightarrow} {\sf California}$	150 ms			

Consequences

Most of the time, pure computing time is not the problem anymore

Most of the time, data transfer is the problem:
[disk] → [memory] → [cache]
[cache] ← [node memory] ↔ [node memory] → [cache]

Once everything is in cache, computations are fast

 \Rightarrow Trees and graphs for AMR

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	Definition		Challenges	Conclusion
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Challenges ir	n computational :	sciences		

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Challenges in computational sciences				
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	Definition		Challenges	Conclusion

A history of challenges
Challenges in computational sciences						
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	Definition		Challenges	Conclusion		

Formalisms

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Challenges in computational sciences						
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	Definition		Challenges	Conclusion		

- 1 Formalisms
- 2 Computational power

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Challenges i				

- 1 Formalisms
- 2 Computational power
- 3 Algorithms

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Challenges i				

- Formalisms
- 2 Computational power
- 3 Algorithms
- 4 Parallelism [present]

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- Formalisms
- 2 Computational power
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- 4 Parallelism [present]
- **5** Data structures [upcoming]

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- 6 Code complexity [future]

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A stack of challenges

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A stack of challenges

Type theory and category theory [theoretical computer science]

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A stack of challenges

- Type theory and category theory [theoretical computer science]
- Programming languages and compilers [computer science]

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- Type theory and category theory [theoretical computer science]
- 2 Programming languages and compilers [computer science]
- 3 Data organization [computer science, computer engineering]

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- Parallelization [computer science, computer engineering]

Introduction	Definition	Limitations	Challenges	Conclusion		
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A stack of challenges

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- 3 Data organization [computer science, computer engineering]
- Parallelization [computer science, computer engineering]
- 5 Numerical methods [applied mathematics]
- 6 Solvers [applied mathematics]
- Physics equations [physics]

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	Definition		Challenges	Conclusion
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Code complexity				

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	Definition		Challenges	Conclusion
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Code complexity				

Implementation and algorithms are technical details.

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	Definition	Challenges	Conclusion
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Code complexity			

Implementation and algorithms are technical details.

The computer scientist's view

The physics is a technical detail.

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Current approaches

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We tend to do work that should be done by computers

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- We tend to do work that should be done by computers
- We bend our physics to make it fit instead of bending languages and compilers

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Implementation and algorithms are technical details.

The computer scientist's view

The physics is a technical detail.

Current approaches

- We tend to do work that should be done by computers
- We bend our physics to make it fit instead of bending languages and compilers
- Compilers can derive equations and do mathematical optimization

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Current approaches

- We tend to do work that should be done by computers
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What is a programming language?



- S: a set of equations to solve
- T: a number (sequence of 0 and 1) to serve as input of a Turing machine
- f: the morphism computed by the compiler

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Introduction	Definition	Limitations	Challenges	Conclusion
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Implementation and algorithms are technical details.

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Current approaches

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What is a programming language?



- S: a set of equations to solve
- T: a number (sequence of 0 and 1) to serve as input of a Turing machine
- f: the morphism computed by the compiler
- Traditional approach: modifying $S \Rightarrow but f$ can be modified too

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	Definition		Challenges	Conclusion
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A type theory	/category theo	ry problem		

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A type theor	ry/category theor	y problem		
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A type theor	v/category theor	v problem		
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Introduction	Definition		Challenges	Conclusion

Parallelism, numerical methods, data structures and physics are all mixed together

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Introduction	Definition		Challenges	Conclusion

- Parallelism, numerical methods, data structures and physics are all mixed together
- Combinatorial explosions of complexity

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- Boils down to a type theory/category theory problem

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- Parallelism, numerical methods, data structures and physics are all mixed together
- Combinatorial explosions of complexity
- Everything but a technical detail
- Boils down to a type theory/category theory problem
- Finding the right abstractions is mostly language independent

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Full GR on cosmological scales

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- Full GR on cosmological scales
- No metric background

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- Full GR on cosmological scales
- No metric background
- Should solve $G_{\mu\nu} = \frac{8\pi G}{c^4} T_{\mu\nu}$ for a given distribution of mass...and that's it

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Why?

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To understand the emergence of cosmology from numerical relativity

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Challenges

Computational power is a no-problem

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Challenges

- Computational power is a no-problem
- Data movement is a rising bottleneck

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Why?

- To understand the emergence of cosmology from numerical relativity
- Regardless of backreaction effects

Challenges

- Computational power is a no-problem
- Data movement is a rising bottleneck
- Code complexity will come after

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	Definition		Challenges	Conclusion
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The main problem of computing is moving from parallelism to data structures

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- The main problem of computing is moving from parallelism to data structures
- There is a lot of room at the bottom of computing: low-level optimizations

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- The main problem of computing is moving from parallelism to data structures
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- Code complexity boils down to a type theory problem: computer scientists needed

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- The main problem of computing is moving from parallelism to data structures
- There is a lot of room at the bottom of computing: low-level optimizations
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- For a well-designed code, physics should almost be a technical detail

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On simplicity

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On simplicity

Doing Full GR cosmological simulations is aiming for less

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On simplicity

- Doing Full GR cosmological simulations is aiming for less
- ... and less is more: more genericity, more correctness, more explainability
- ... to understand the emergence of cosmology from numerical relativity

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On simplicity

- Doing Full GR cosmological simulations is aiming for less
- ... and less is more: more genericity, more correctness, more explainability
- ... to understand the emergence of cosmology from numerical relativity

Conclusion

"Simplicity is the final achievement. After one has played a vast quantity of notes and more notes, it is simplicity that emerges as the crowning reward of art." *Fryderyk Chopin*

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Thank you for your attention

Any question?



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