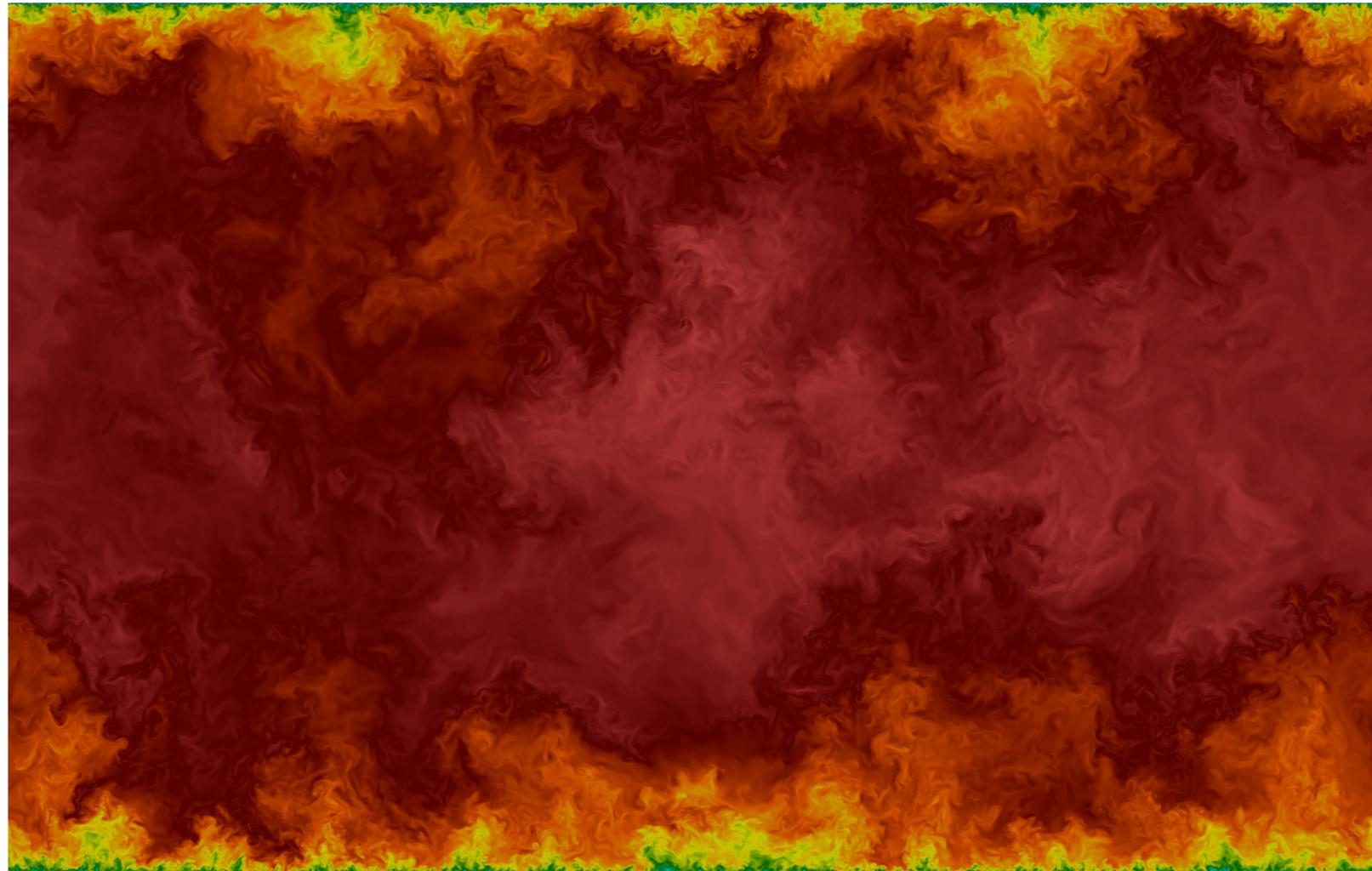


tooling up for extreme-scale simulations of turbulent flows



Pedro Costa

TU Delft, Mechanical Engineering, Process & Energy Department
P.SimoesCosta@tudelft.nl



NUM-SCARS, CWI, 23 January 2026

acknowledgements

TU Delft



J. Peeters



R. Diez



D. Palancha

NVIDIA



J. Romero



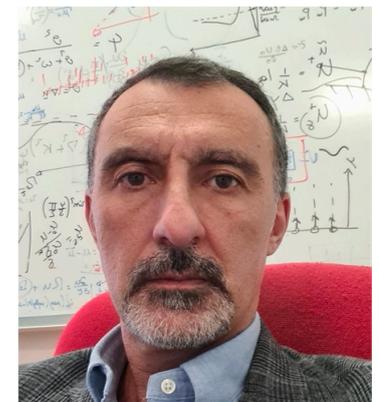
M. Fatica

GSSI



R. Verzicco

U. Rome La Sapienza



S. Pirozzoli



outline

- motivation
- DNS of turbulent flows with immersed interfaces (e.g., obstacles, particles, or multi-fluid flows)
- tailoring our DNS solver for extreme-scale simulations on many GPUs
 - numerical method tailoring
 - **runtime performance autotuning**
 - mixed precision & **distributed TDMA**
 - **fast solver for non-uniform grids**
- summary & outlook



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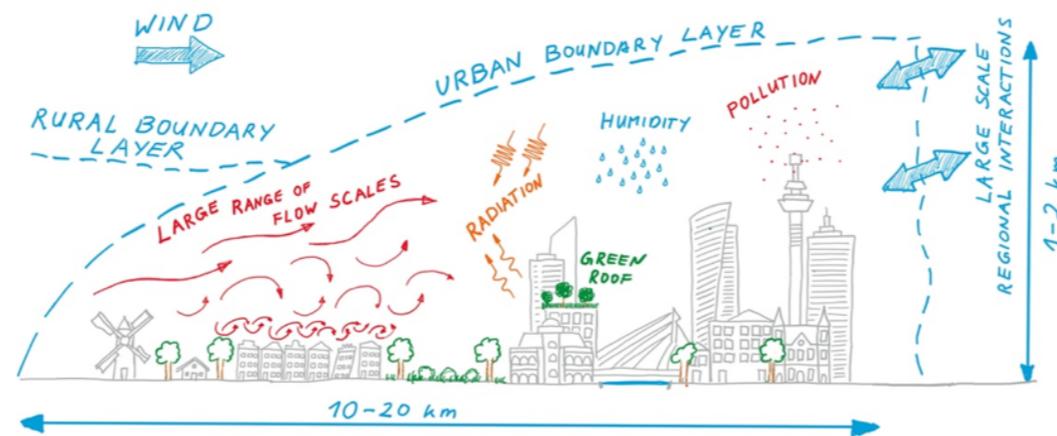
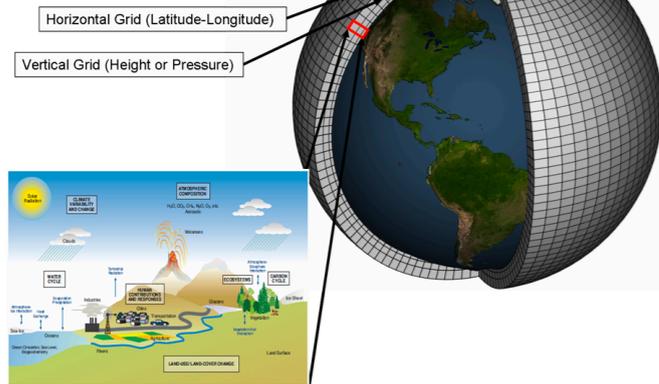
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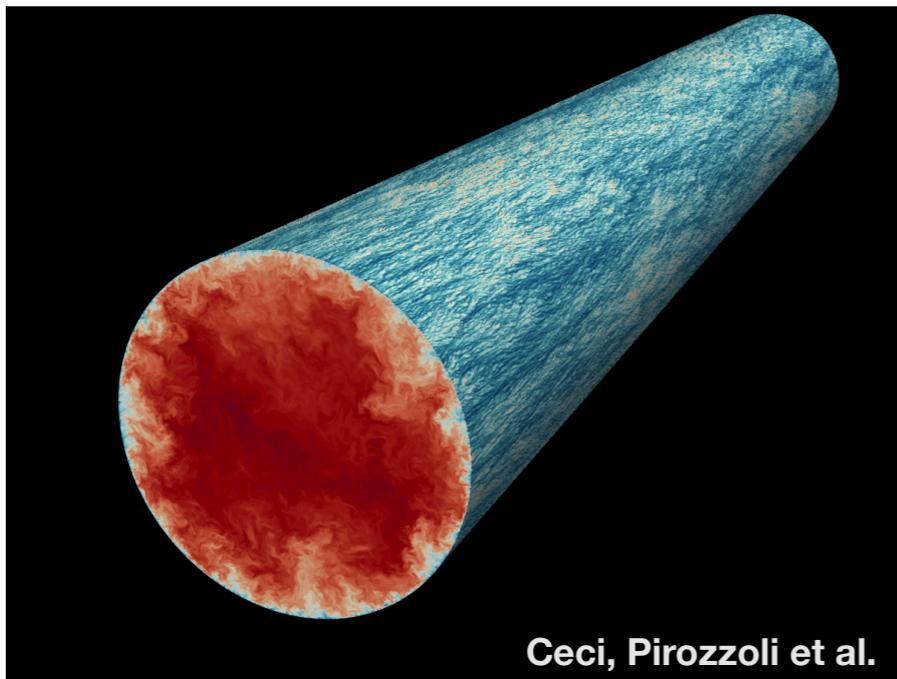
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why keep pushing the limits of our numerical solvers?

Schematic for Global Atmospheric Model

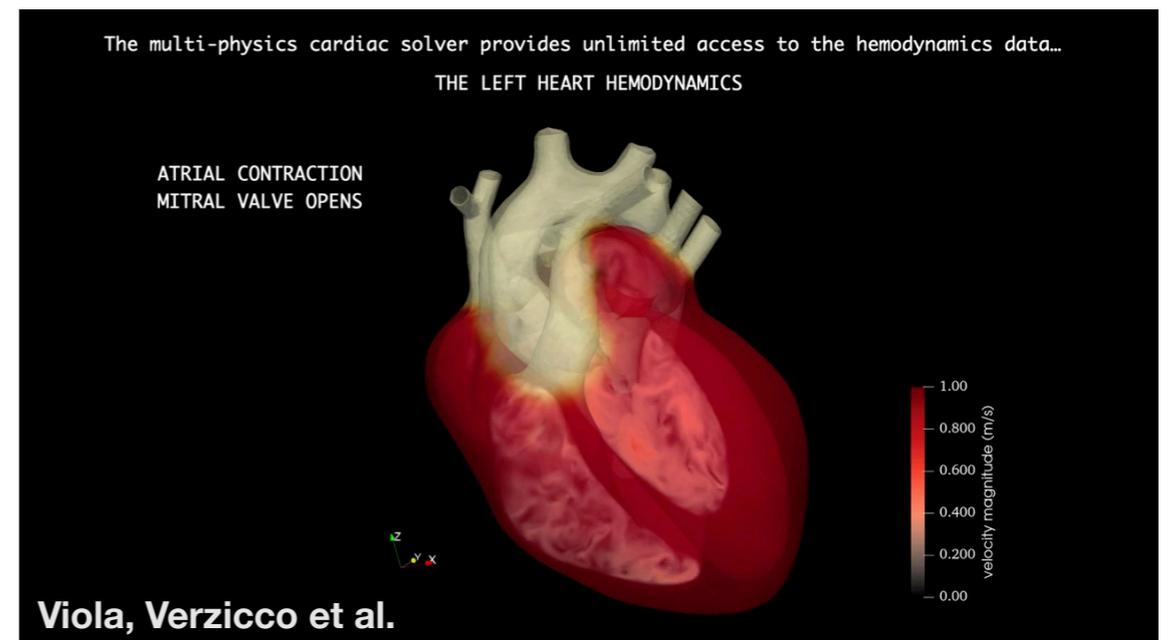


climate / energy
need to **increase resolution!**



Ceci, Pirozzoli et al.

wall turbulence fundamentals
need **higher Reynolds numbers**



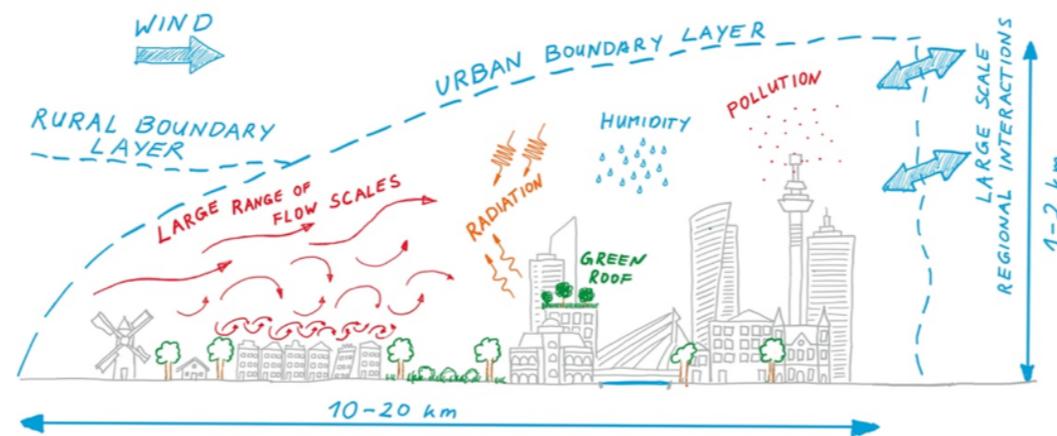
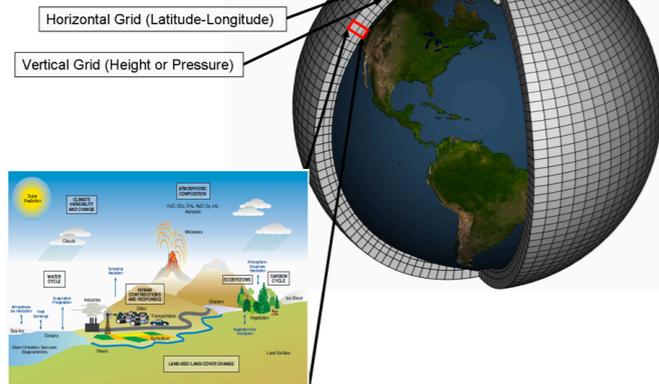
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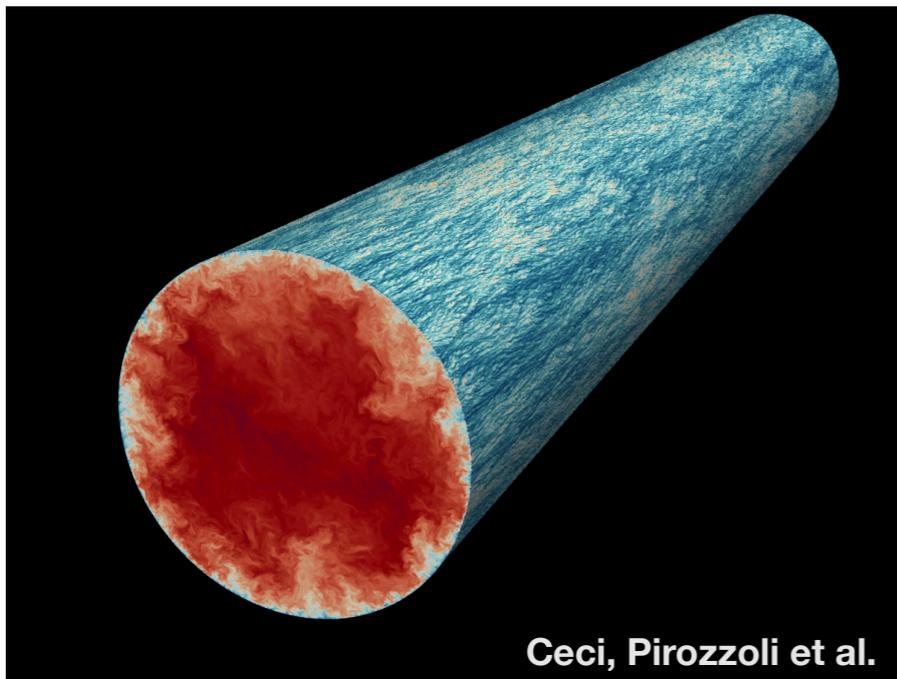
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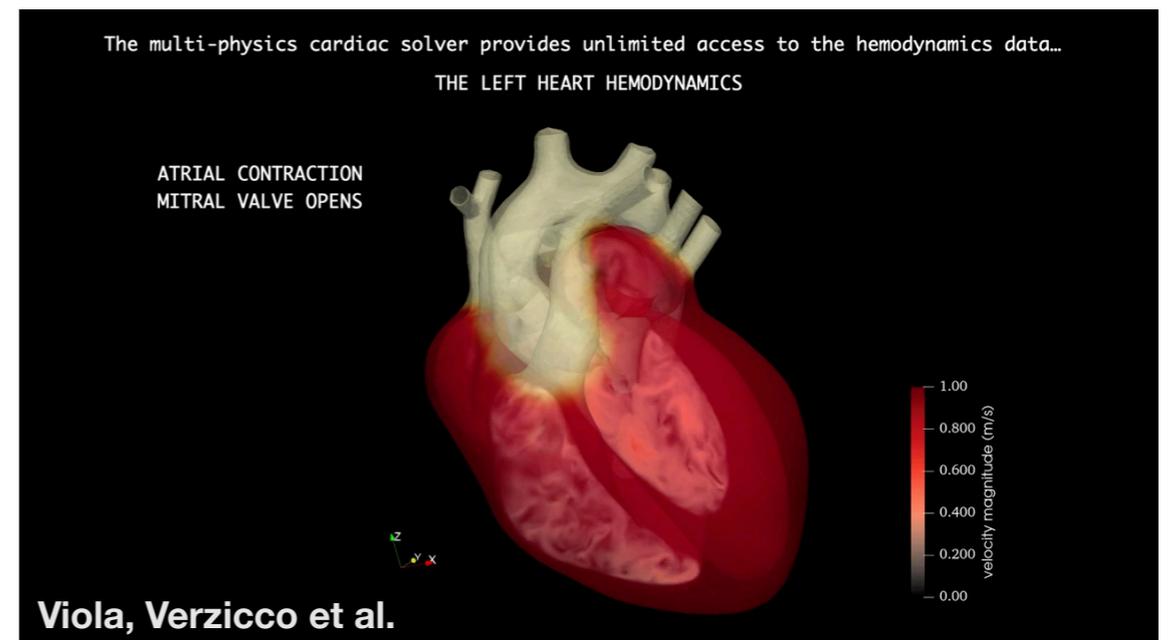


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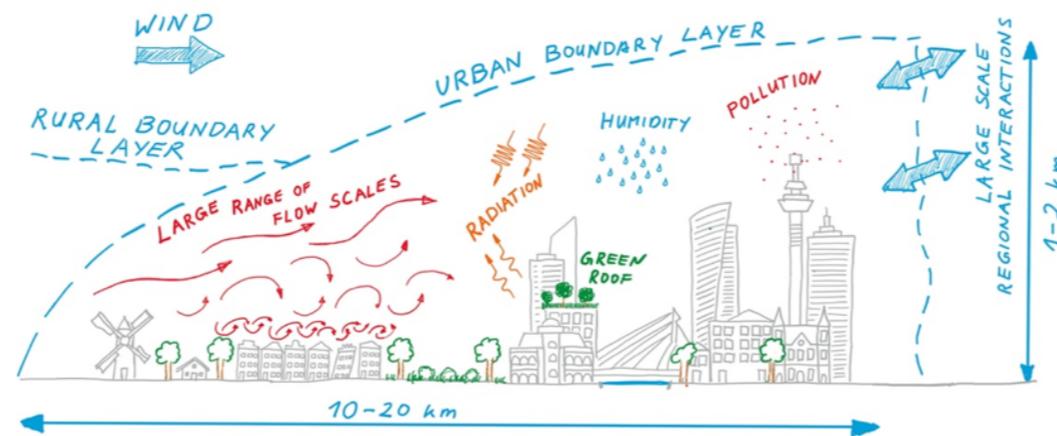
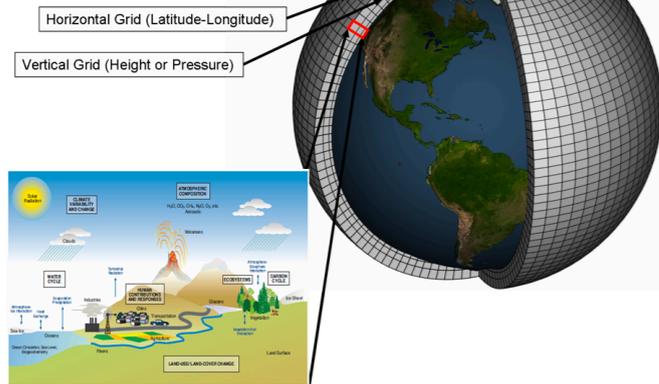
continuous demand for resolving larger systems / many small systems faster



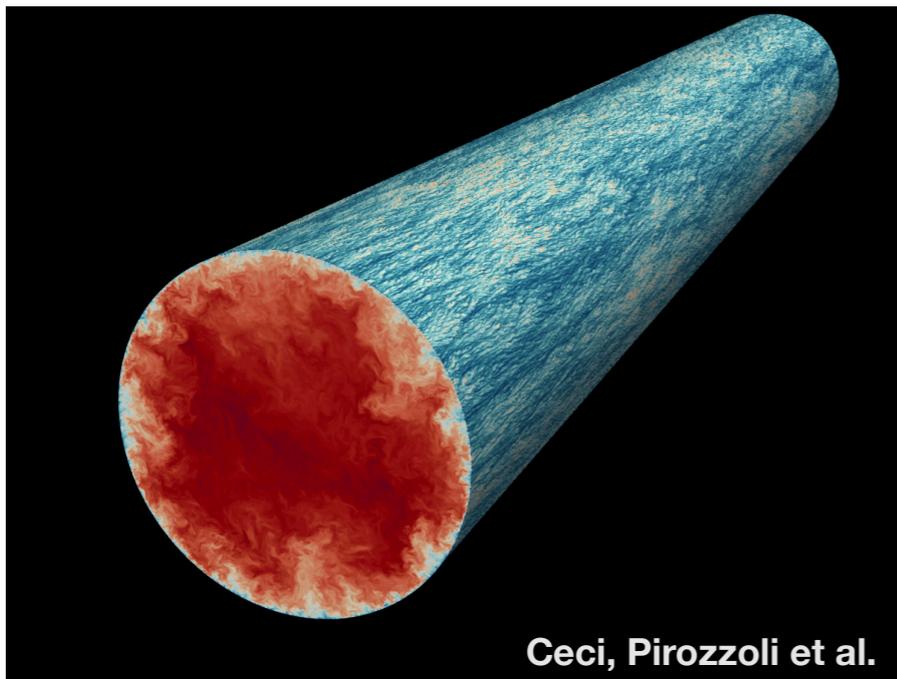
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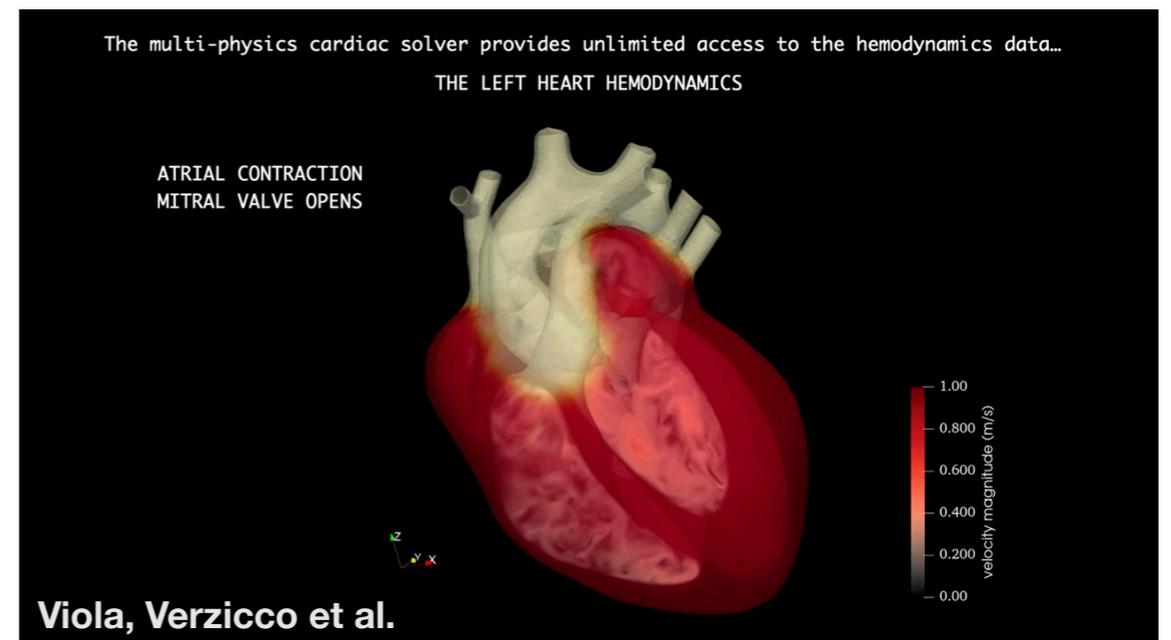


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change in paradigm

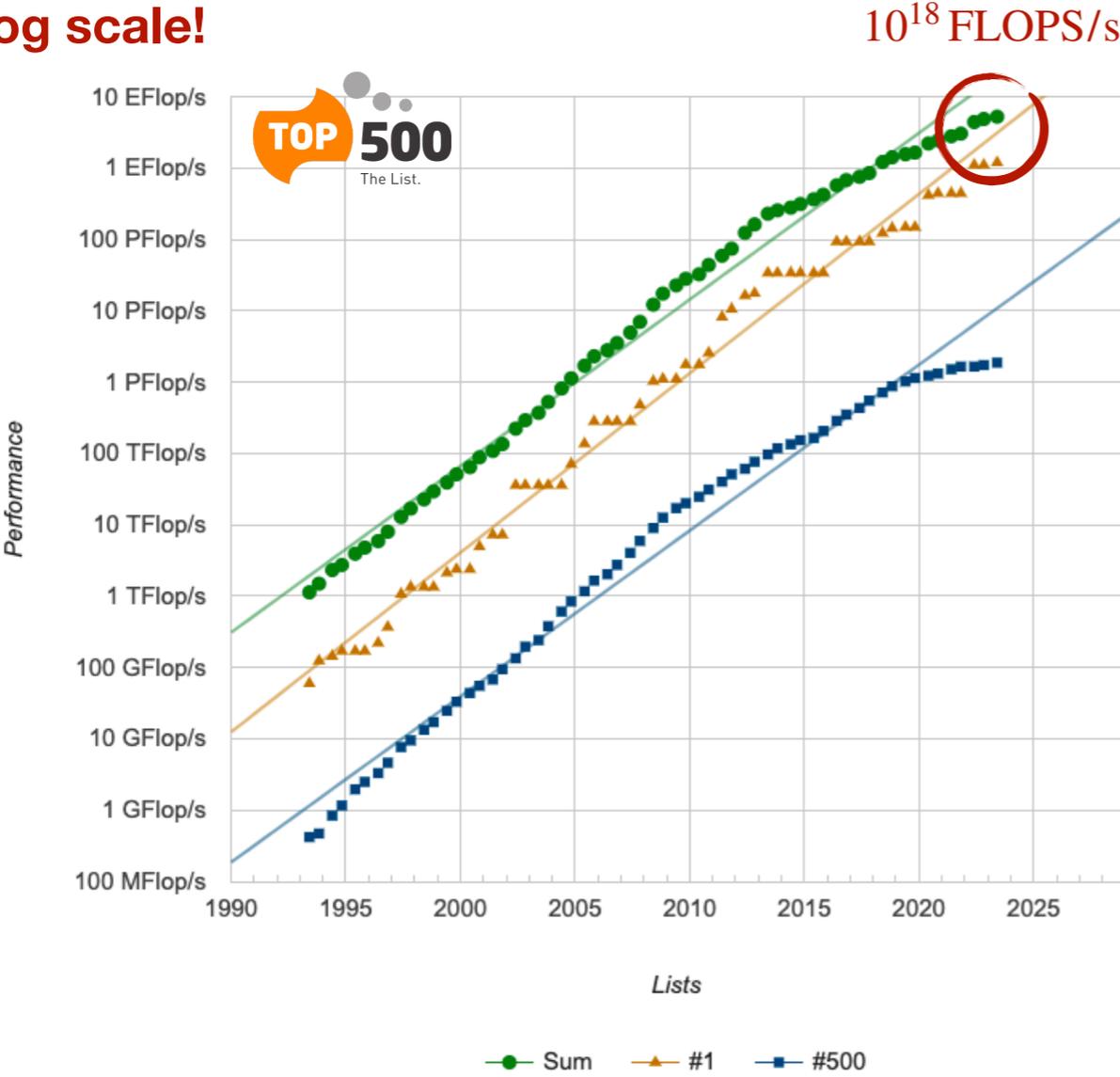
log scale!

10^{18} FLOPS/s



change in paradigm

log scale!



Sister's age calculation

I'm 5 years old and my sister is half my age. How old will she be when I'm 50. Show your work

Your sister is currently 5 years old (because you are 5 years old and she is half your age)

If we assume you both age in a linear manner, your sister's age will increase by the same number of years as you age.

So, when you are 50, she will be $50 - 5 = 45$ years old.

Another way to see it:

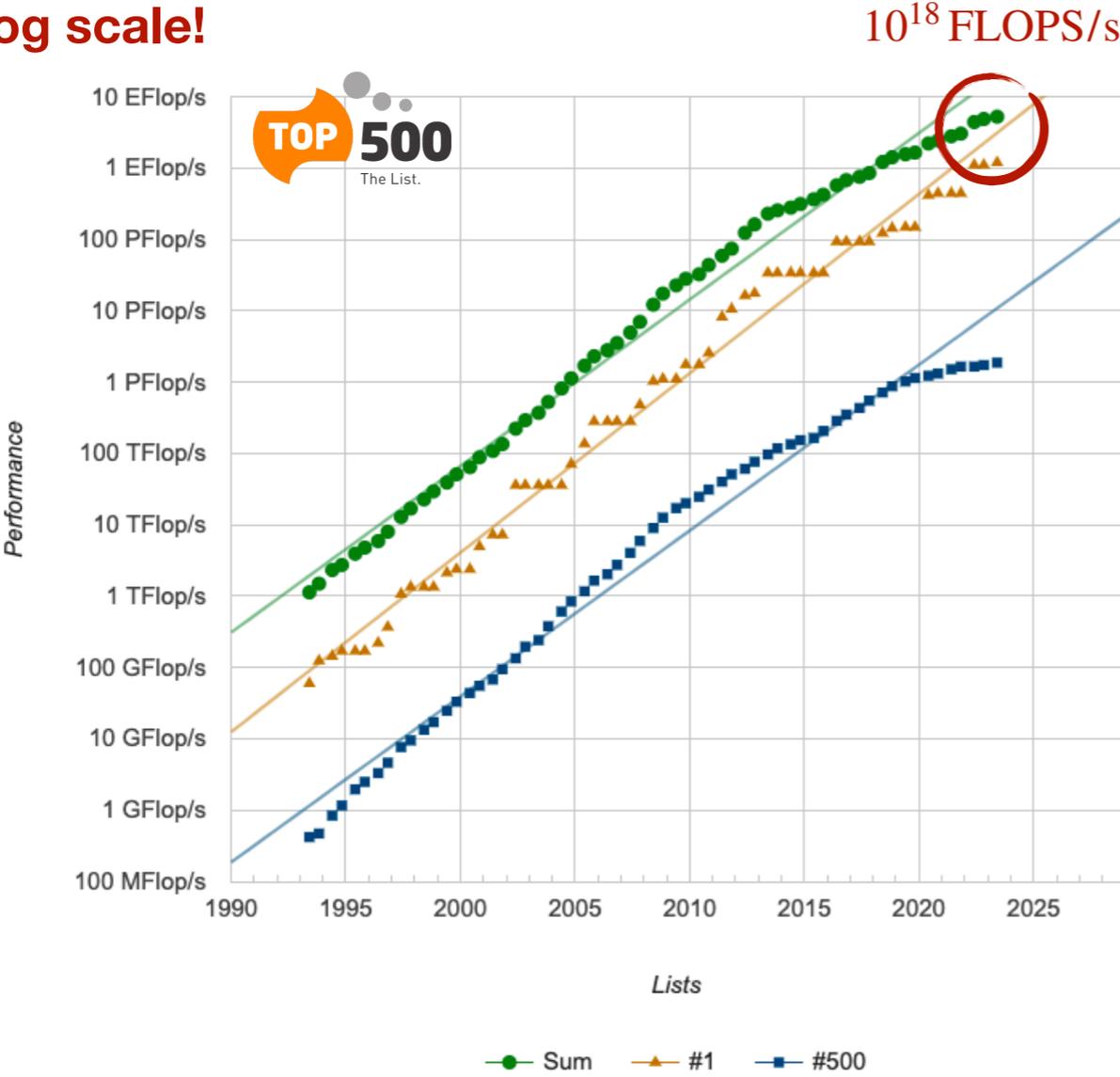
As your sister's age is half your age, you can multiply your age by 2 to find her age.

So, at age 50, your sister will be $50 * 2 = 100 / 2 = 50$ years old.



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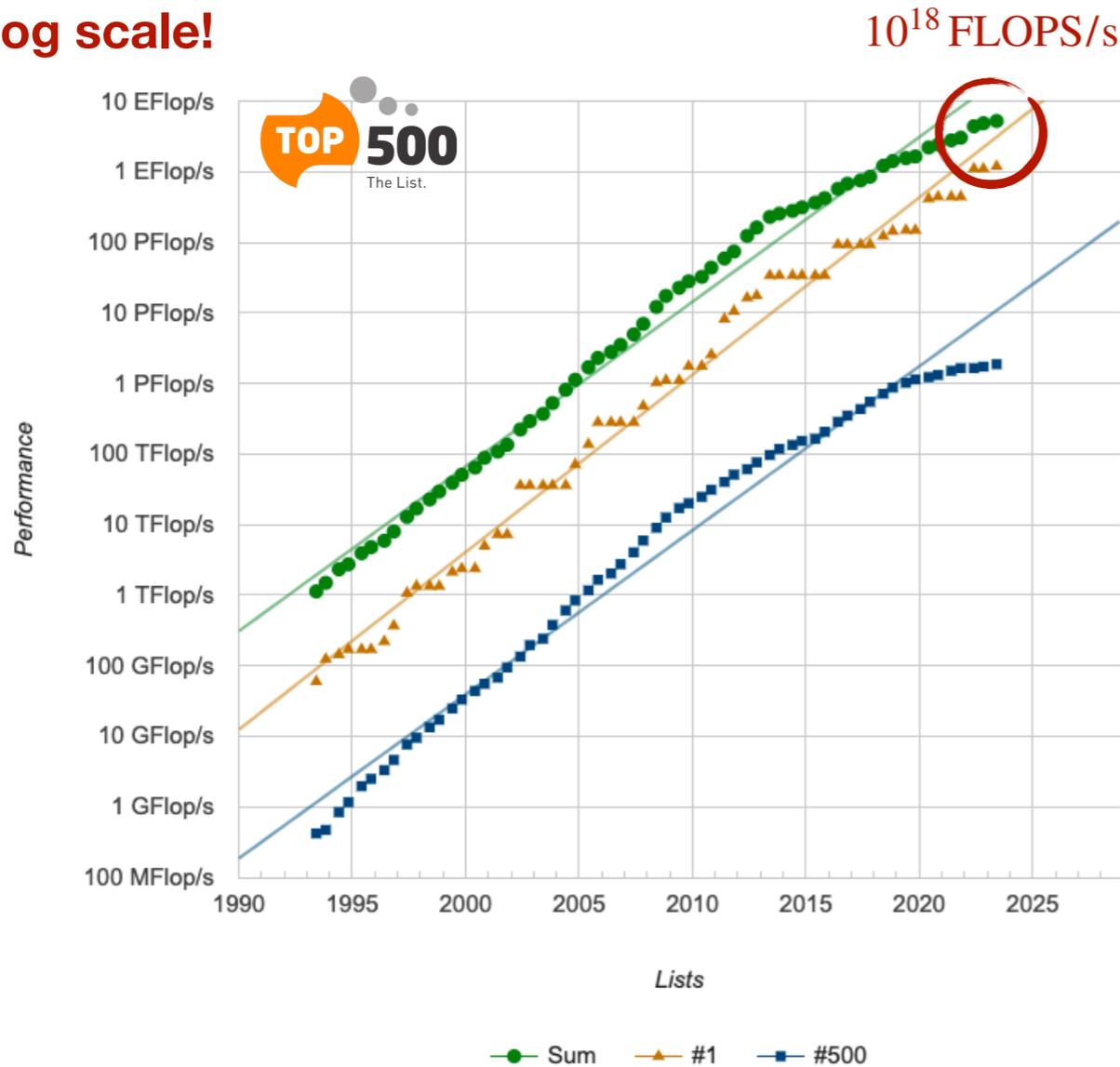
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adapting to this change is annoyingly hard...
but the benefits are big!



interface-resolved DNS to study multiphase flows / flows in complex geometries



interface-resolved simulations of turbulent multiphase flows / flows over complex surfaces

ingredients

- fast Navier-Stokes solver
- efficient parallelization of the numerical algorithm so it can operate on many GPUs/GPUs
- immersed-interface approach for interphase coupling
- subgrid-scale closures often needed



Navier-Stokes eq.

$$\begin{aligned} \nabla \cdot \mathbf{u} &= 0 \\ \frac{D\mathbf{u}}{Dt} &= -\nabla p + \frac{1}{\text{Re}} \nabla^2 \mathbf{u} \end{aligned}$$

$$\mathbf{u} = \mathbf{U}_p(\mathbf{X})$$

Newton-Euler eq.

$$\begin{aligned} \rho_p V_c \frac{d\mathbf{u}_c}{dt} &= \oint_S \boldsymbol{\tau} \cdot \mathbf{n} dS + (\rho_p - \rho_f) V_p \mathbf{g} + \mathbf{F}_c \\ I_p \frac{d\boldsymbol{\omega}_c}{dt} &= \oint_S \mathbf{r} \times (\boldsymbol{\tau} \cdot \mathbf{n}) dS + \mathbf{T}_c \end{aligned}$$



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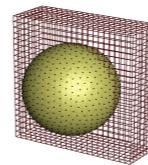
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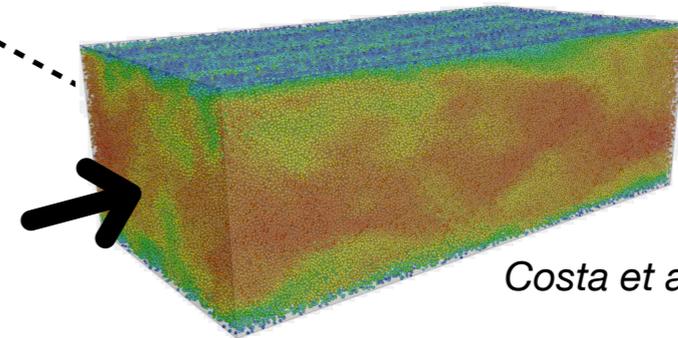
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Breugem, JCP 2012



Costa et al. PRL



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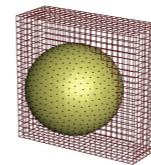
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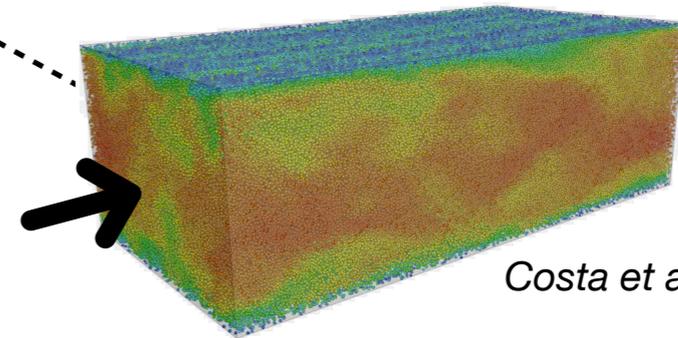
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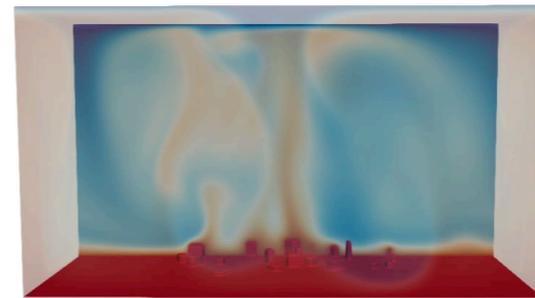
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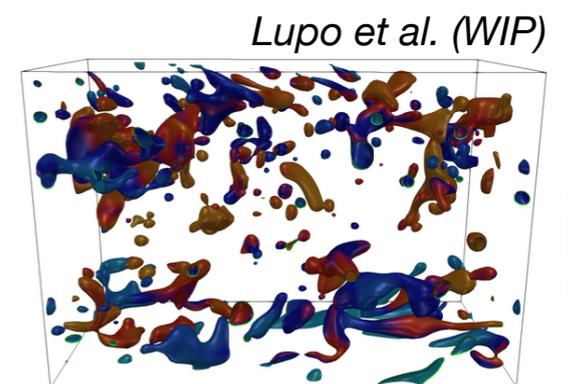
Breugem, JCP 2012



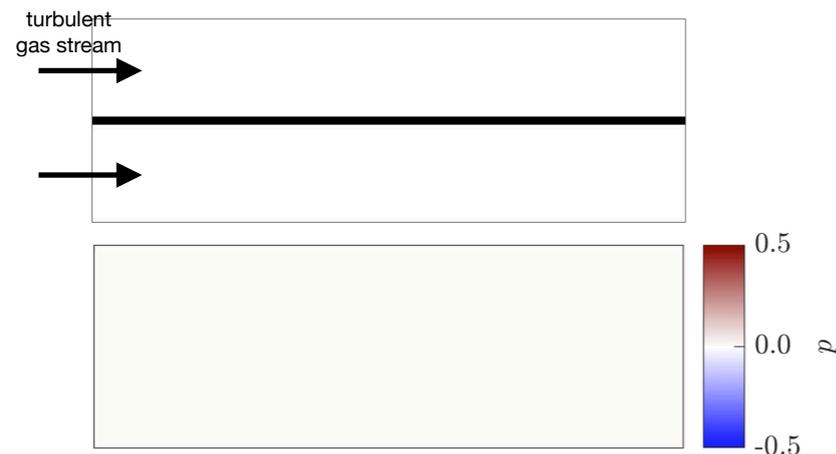
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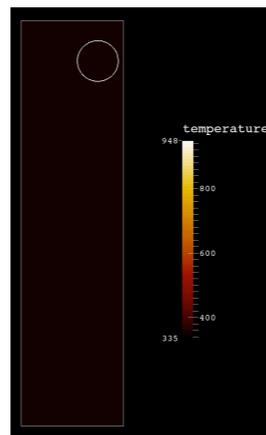
A. Pavan, et al. (WIP)



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Kozul et al. PRF



Scapin et al., JCP



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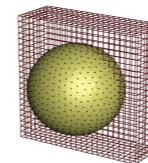
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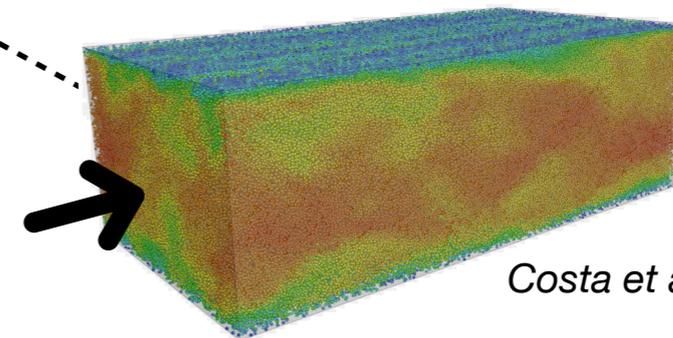
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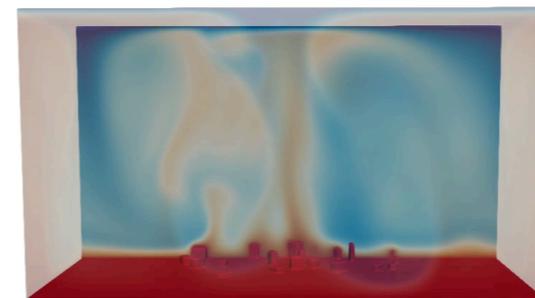
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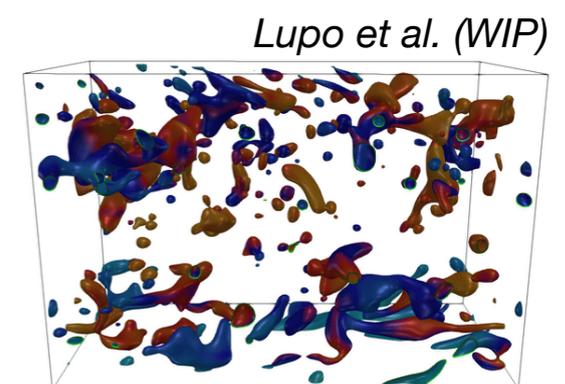
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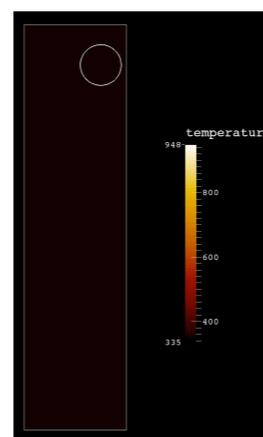


Lupo et al. (WIP)

Velocity Magnitude



Kozul et al. PRF



Scapin et al., JCP



baseline incompressible Navier-Stokes solver



base Navier-Stokes solver



[GitHub.com/CaNS-World/CaNS](https://github.com/CaNS-World/CaNS)

- modern Fortran first drafted summer 2017
- simple cartesian 2nd-order FD/FV incompressible Navier-Stokes solver
- incremental pressure projection scheme; RK3 time integration with explicit/implicit/z-implicit treatment for diffusion terms
- *versatile FFT-based Poisson solver*, supporting a wide family of boundary conditions (combining fast *Fourier/sine/cosine transform w/ TDMA*)
- *recent refactoring of GPU porting refactored in v2.0* (late 2022) — many-GPU implementation using OpenACC and a hardware-adaptive domain-decomposition
- **our base solver** for multiphase flows, obstacle-resolved DNS over complex surfaces, and flows strong property variations, (non-)Oberbeck-Boussinesq convection
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- **based on old (but gold) computational methods** 🖱️

Swarztrauber. *Siam Rev.* 19.3 (1977): 490-501
Schumann & Sweet. (1988) *JCP* 75.1 123-137
Costa. *CAMWA* 76 (2018) 1853-1862
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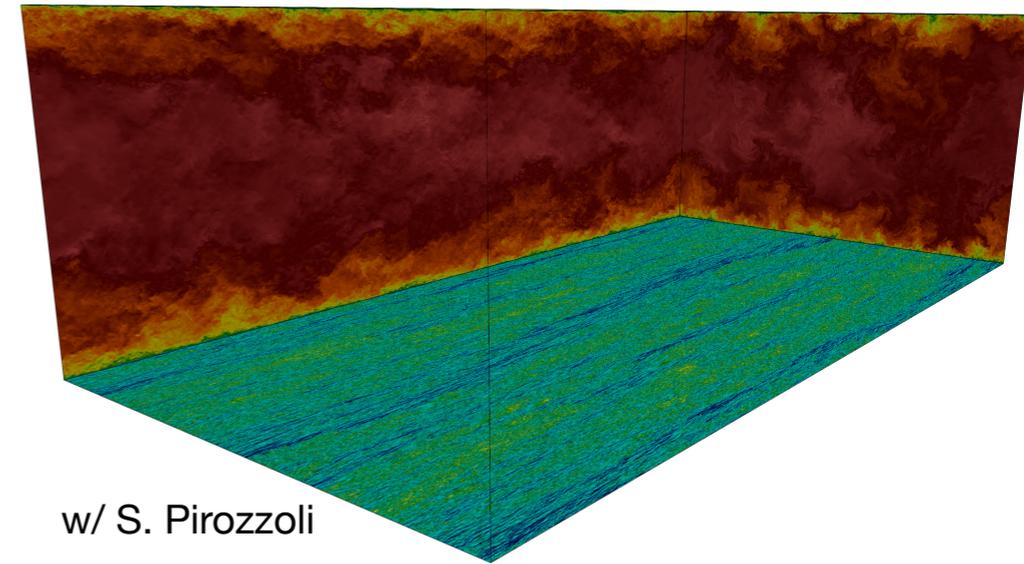


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w/ S. Pirozzoli



channel flow DNS

325×10^9 grid cells

solved on 1024 NV A100 64Gb GPUs

64 Tb of RAM

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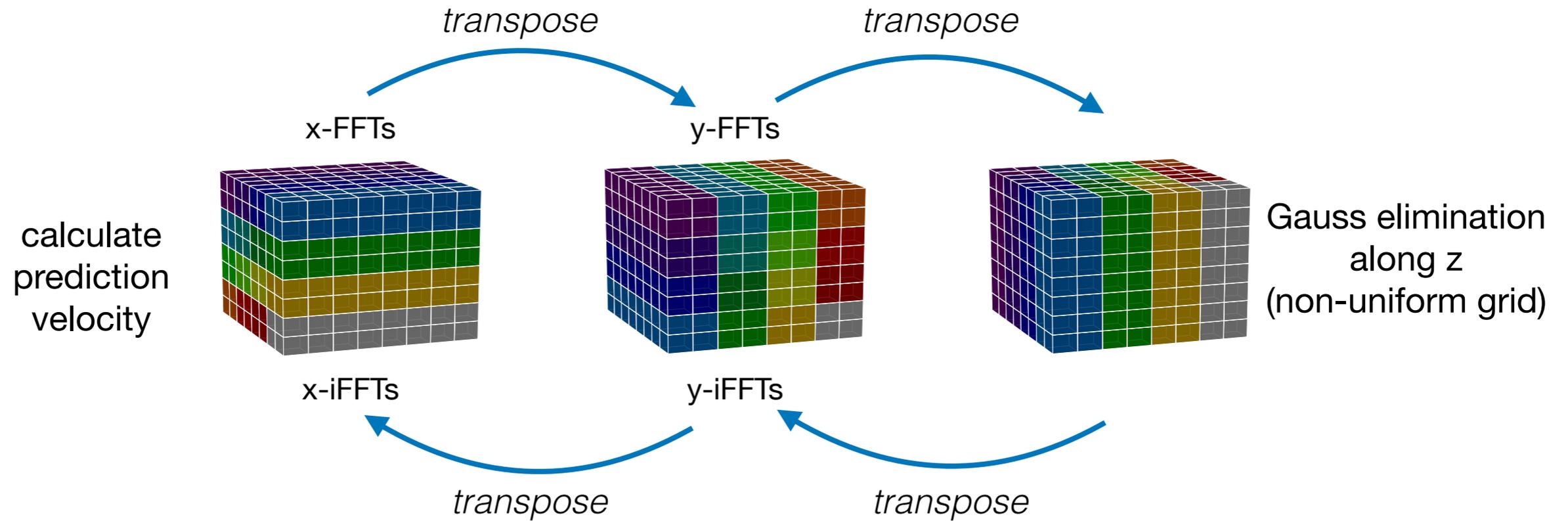
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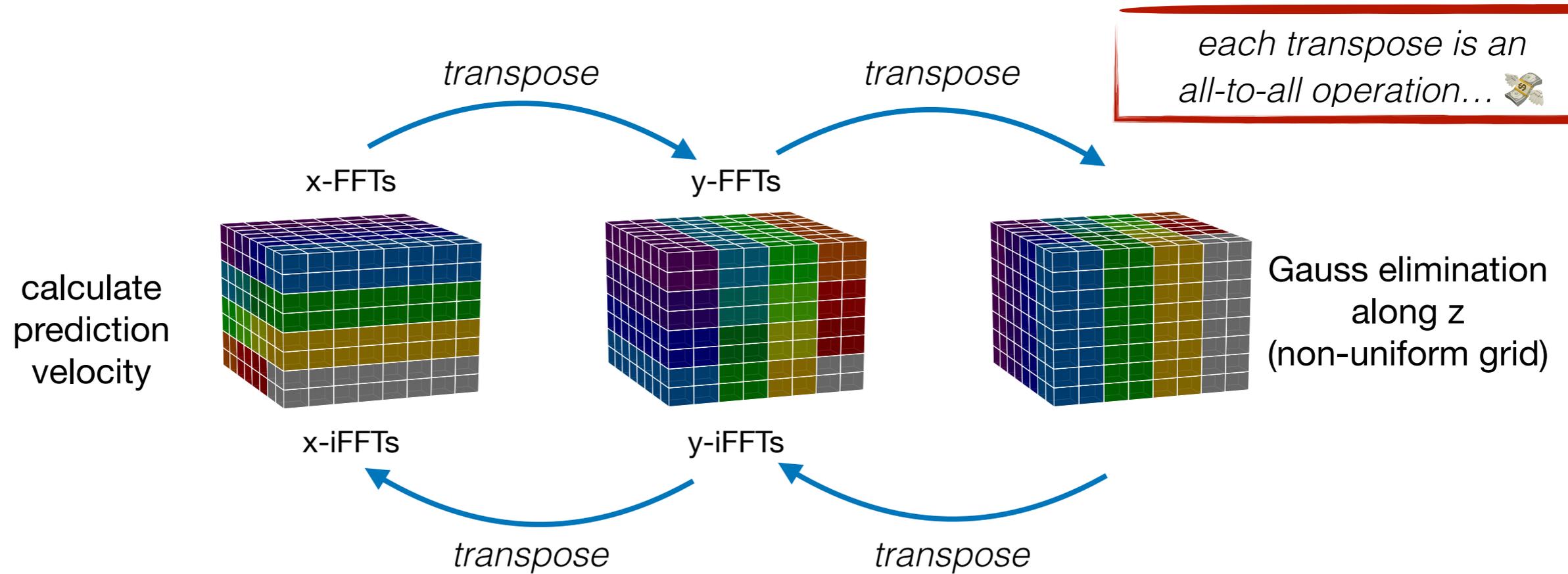
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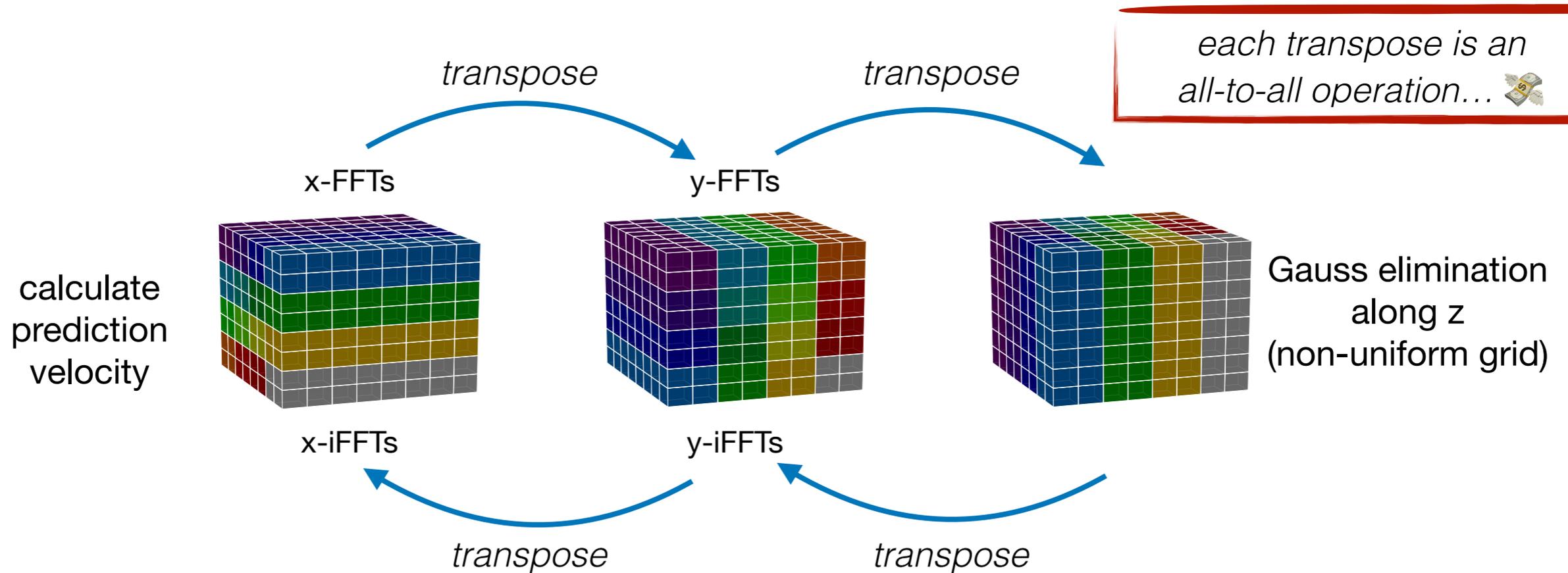
Poisson solver workload



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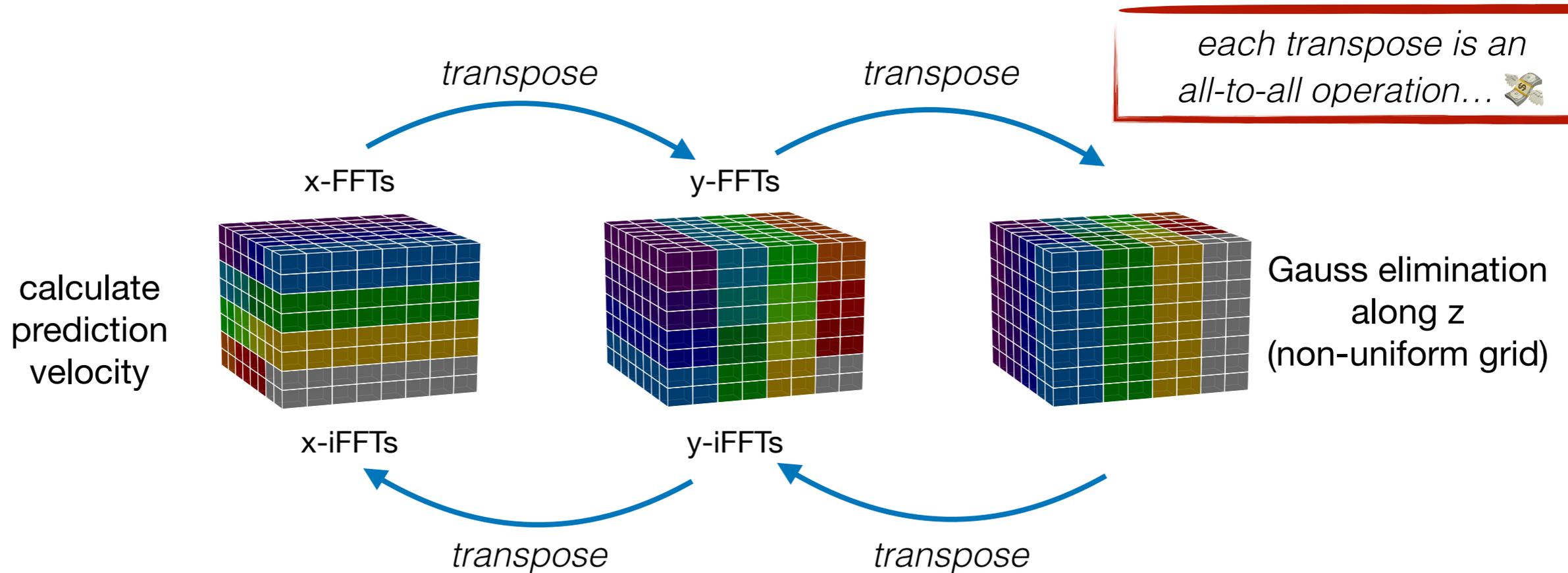


fast and versatile single-box solvers proven to *perform well on many-CPU systems*

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Li & Laizet. Cray user group (2010),
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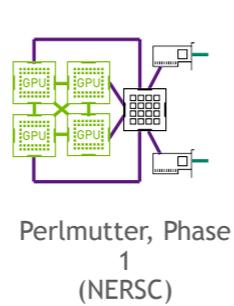
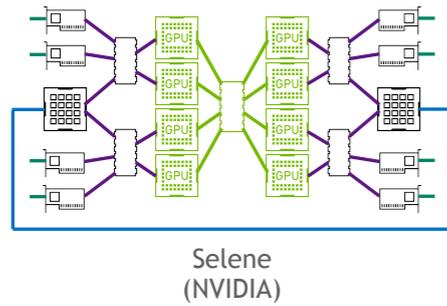
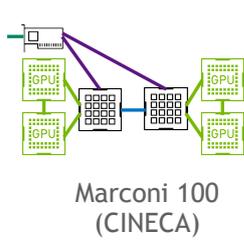
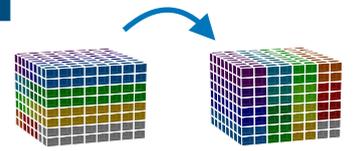
what about GPU-based systems?

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hardware-aware many-GPU Poisson solver

issues beyond the reach of the fluid dynamicist



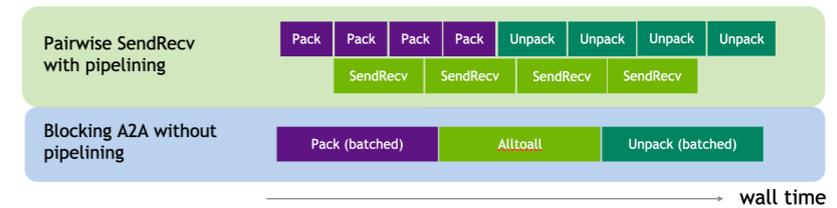
NCCL

NVSHMEM

MPI
OpenMPI
Spectrum MPI
Cray MPICH
MVAPICH

many possible cluster
node topologies

zoo of possible GPU-GPU communication
backends *which one to pick?*

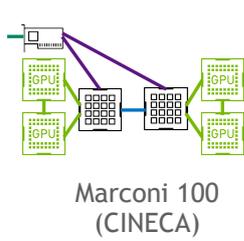
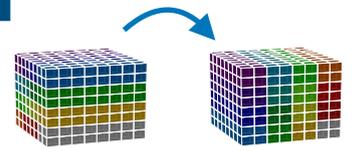


... and many possible low level
implementations
which one to implement?

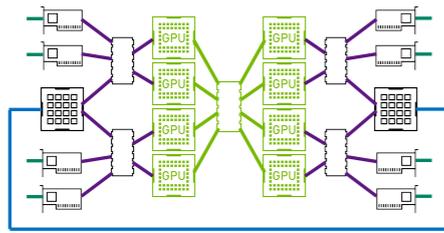


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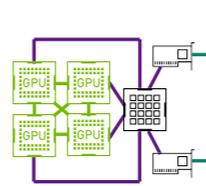
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Marconi 100
(CINECA)



Selene
(NVIDIA)

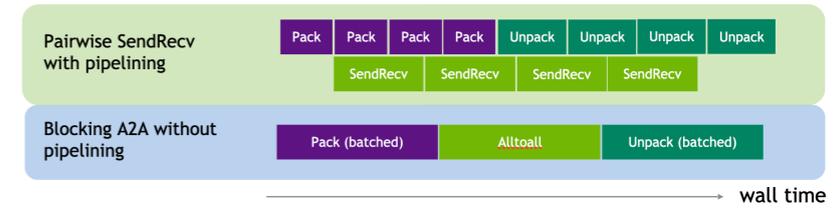


Perlmutter, Phase
1
(NERSC)

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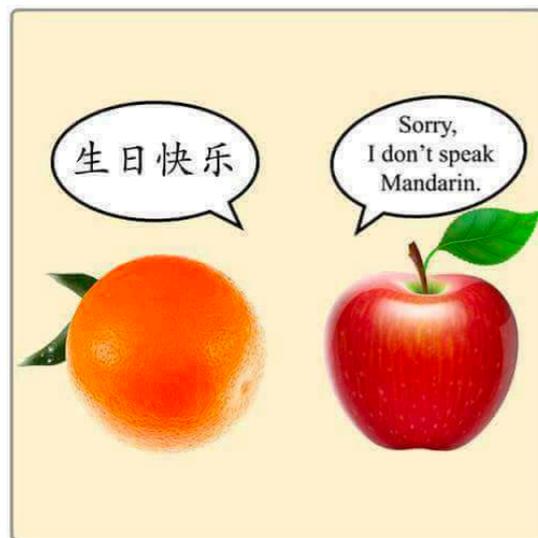


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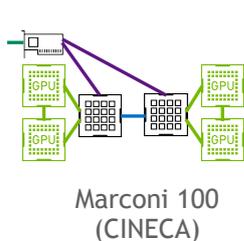
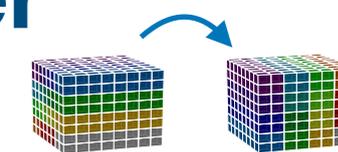
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which one to implement?

how to be sure to exploit resources optimally with this wide array of possibilities?

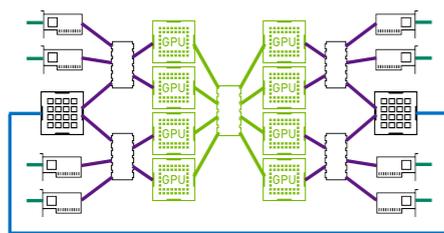


hardware-aware many-GPU Poisson solver

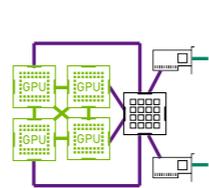
issues beyond the reach of the fluid dynamicist



Marconi 100 (CINECA)



Selene (NVIDIA)

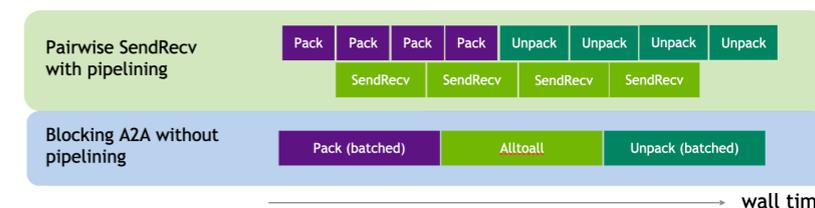


Perlmutter, Phase 1 (NERSC)

NCCL

NVSHMEM

MPI
OpenMPI
Spectrum MPI
Cray MPICH
MVAPICH

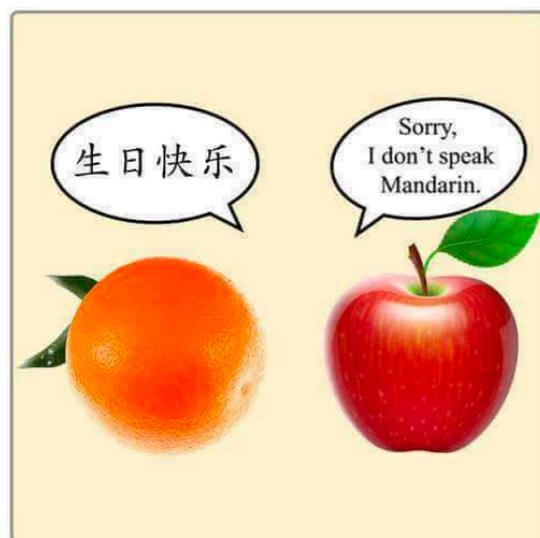


many possible cluster node topologies

zoo of possible GPU-GPU communication backends *which one to pick?*

... and many possible low level implementations *which one to implement?*

how to be sure to exploit resources optimally with this wide array of possibilities?



github.com/NVIDIA/cuDecomp



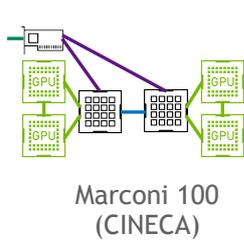
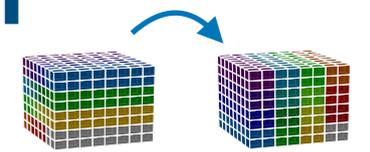
- NVIDIA library developed along with CaNS 2.0
- inspired by the 2decomp&FFT
- runtime performance autotuning chooses the best of all options!

Romero, et al. PASC22 (2022)

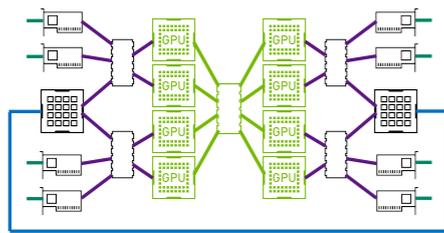


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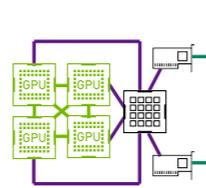
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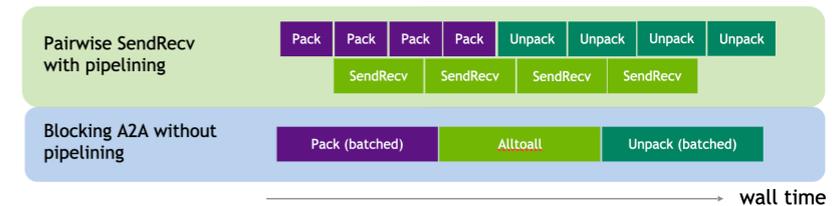


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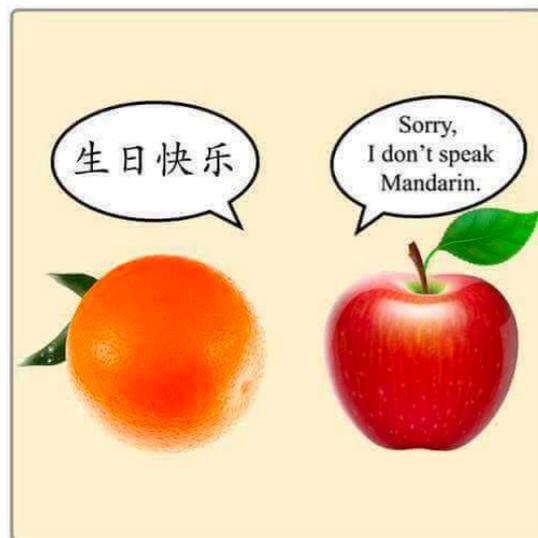


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2decomp&fft — [GitHub.com/2decomp-fft/2decomp-fft](https://github.com/2decomp-fft/2decomp-fft) also supports GPUs

Romero, et al. PASC22 (2022)

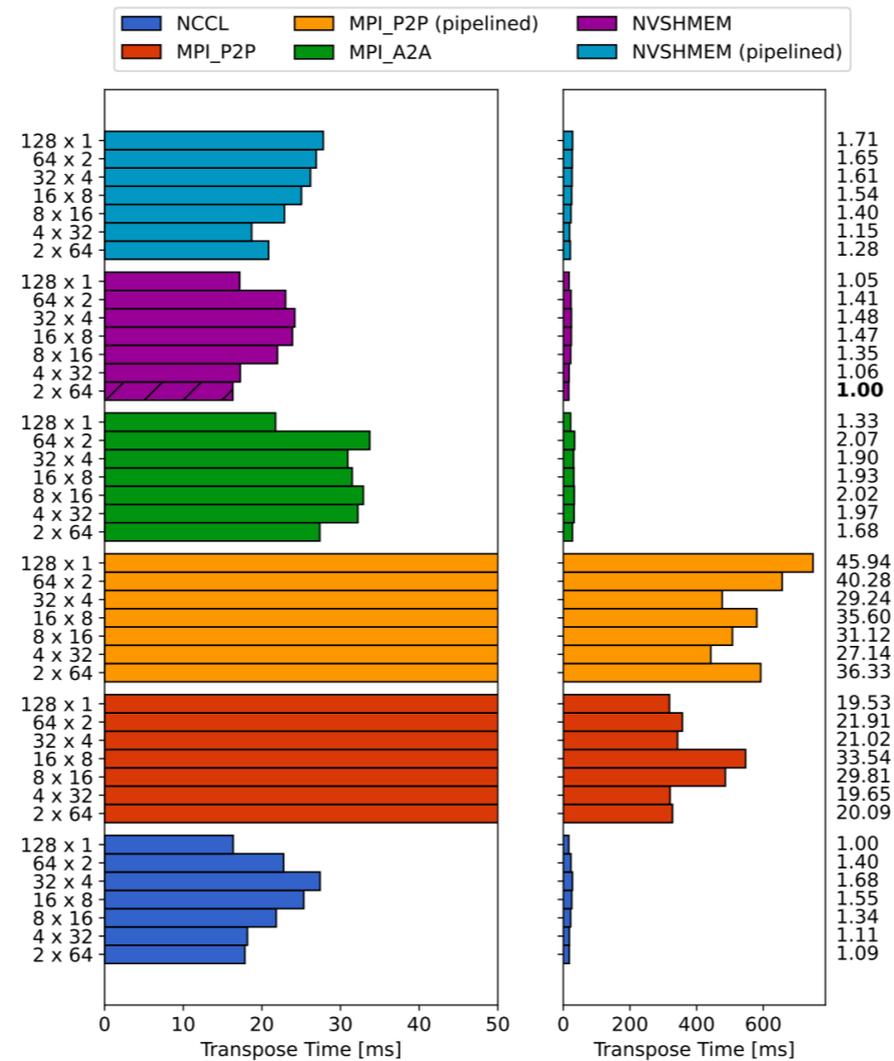


importance of runtime autotuning



importance of runtime autotuning

tuning 128 GPU run on Marconi 100



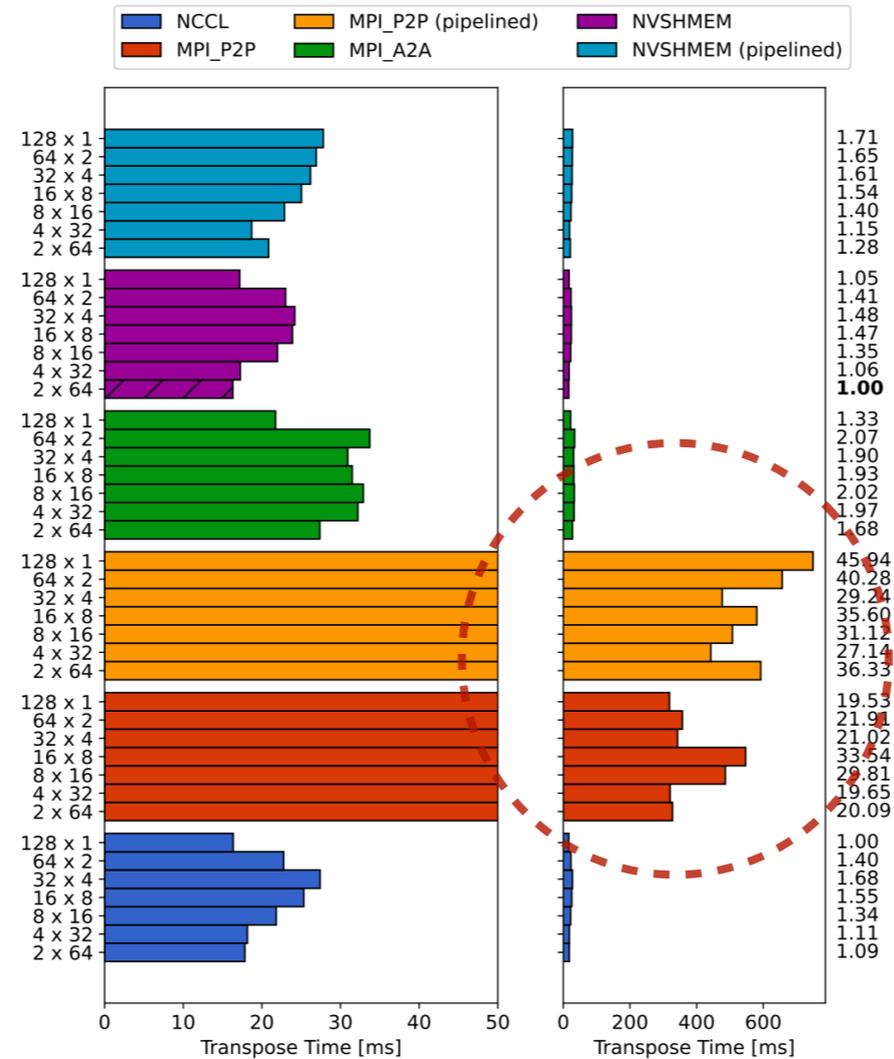
average transpose time

Romero et al. PASC (2022)



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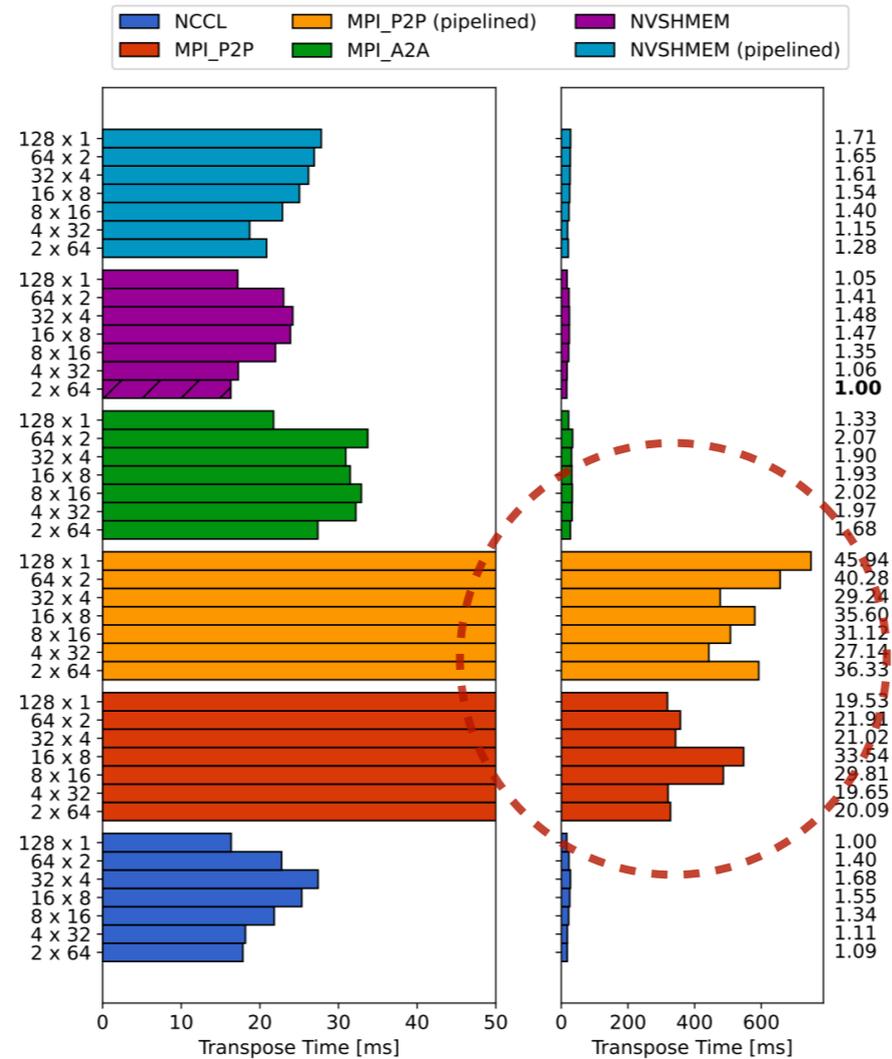
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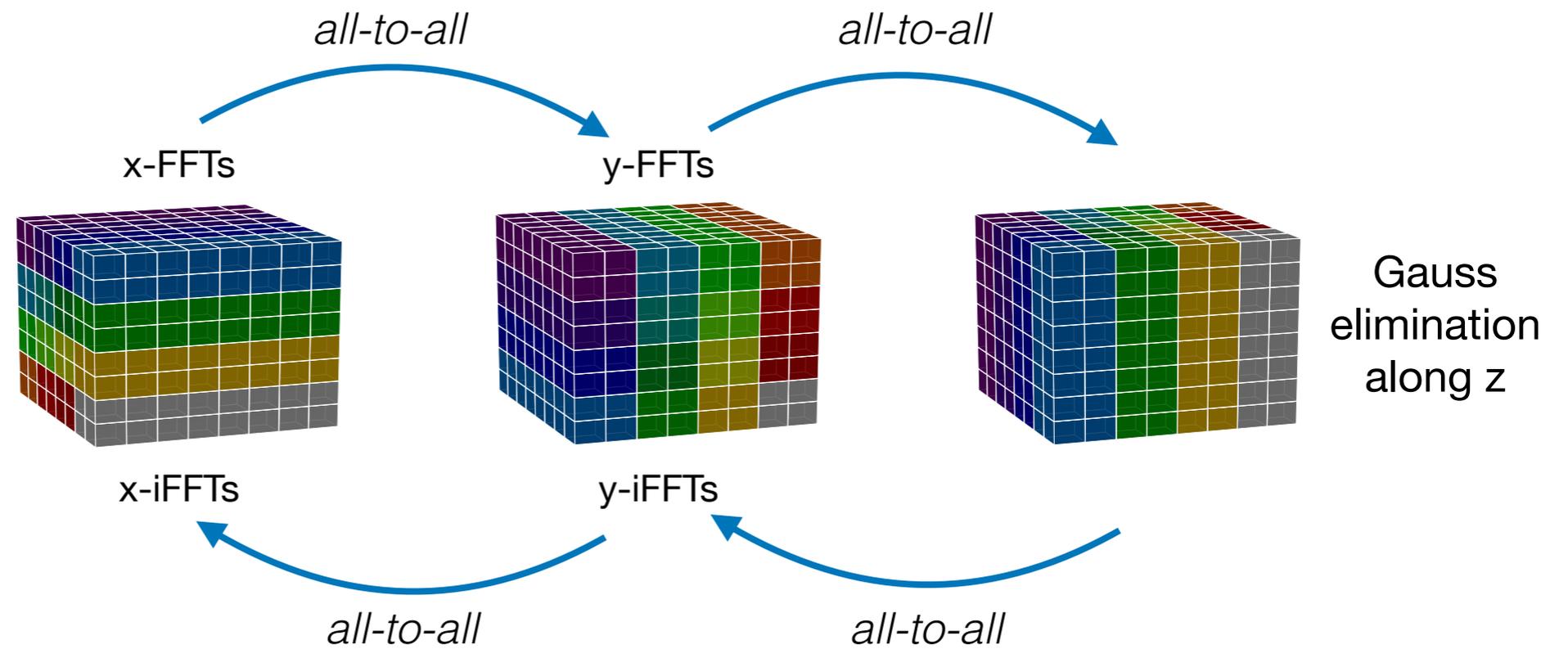
average transpose time

Romero et al. PASC (2022)

having now a highly optimized code on many GPUs, can we do even better?

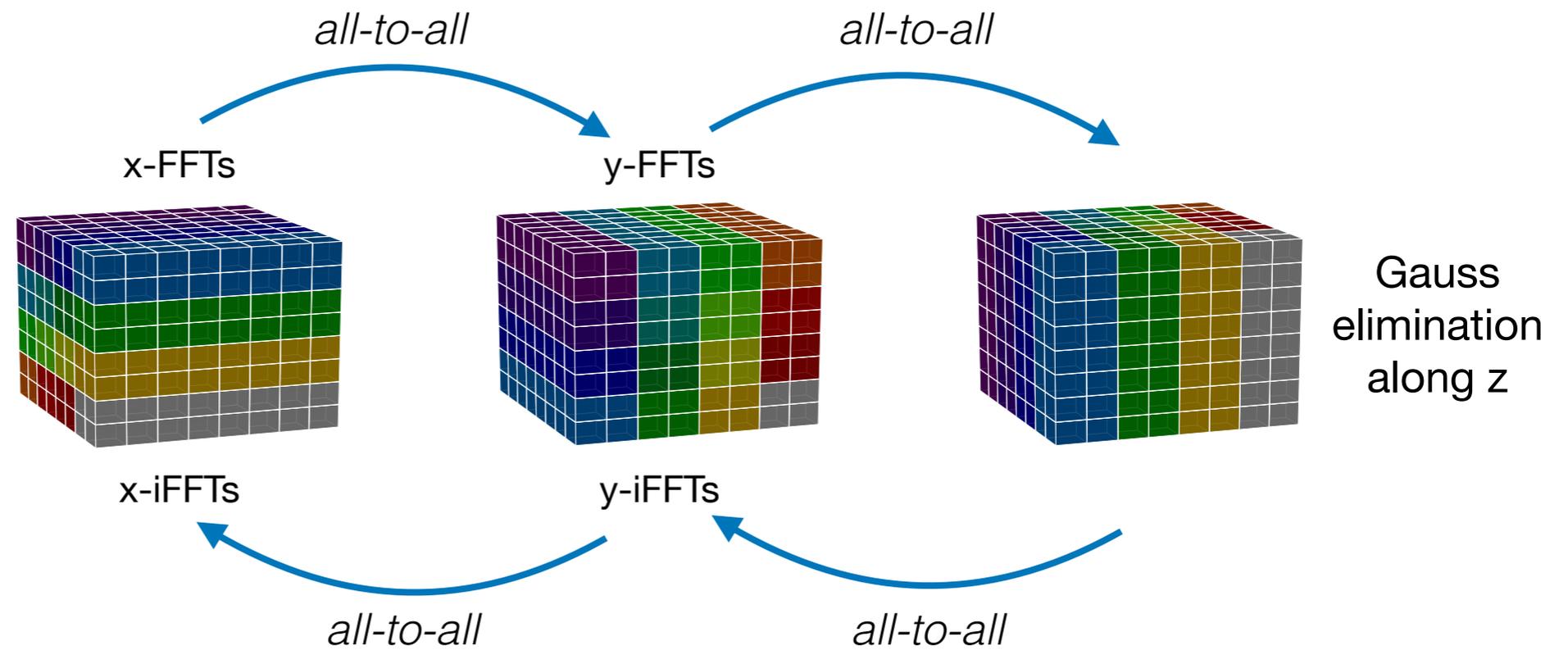


mixed-precision Navier-Stokes solver (skipped)

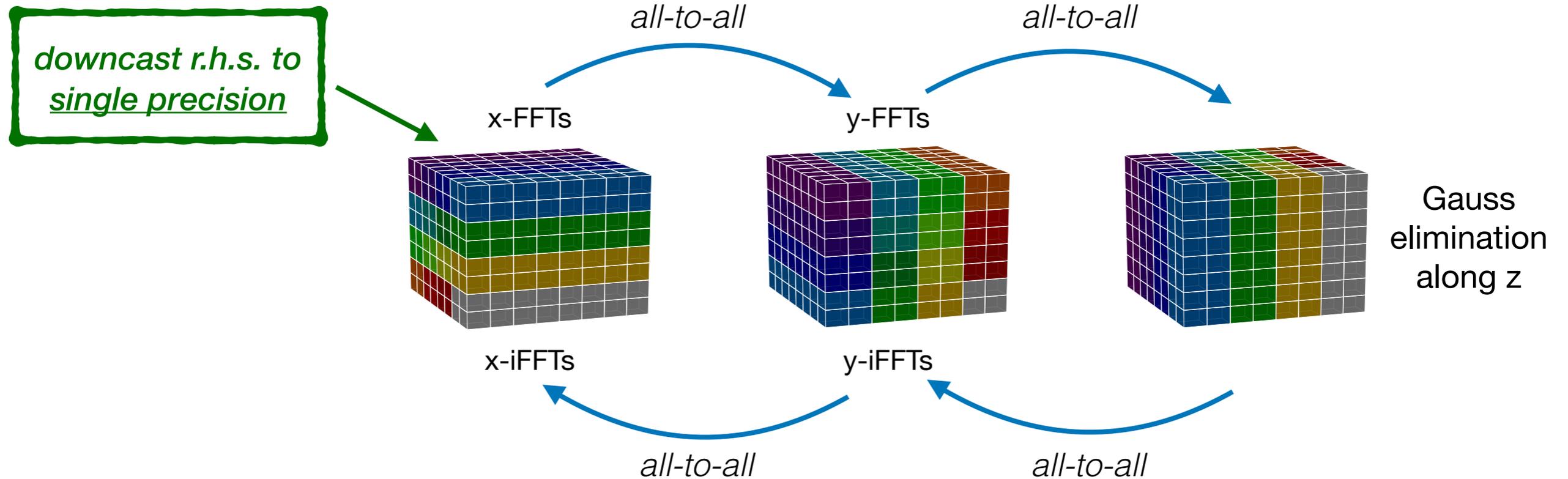


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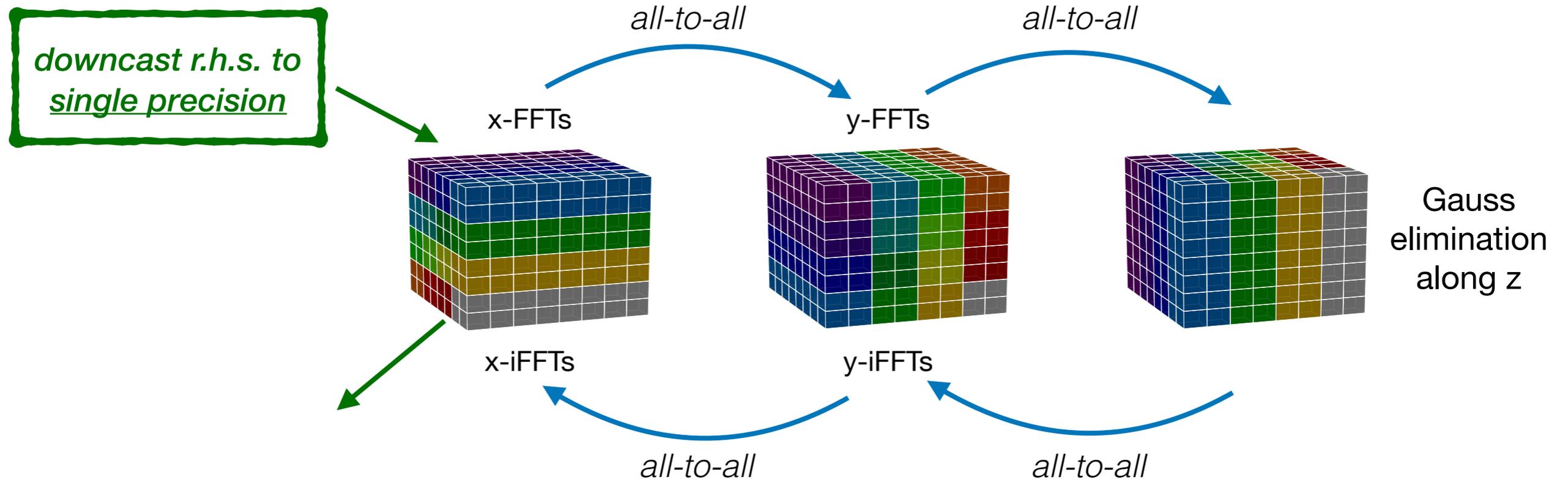
*downcast r.h.s. to
single precision*



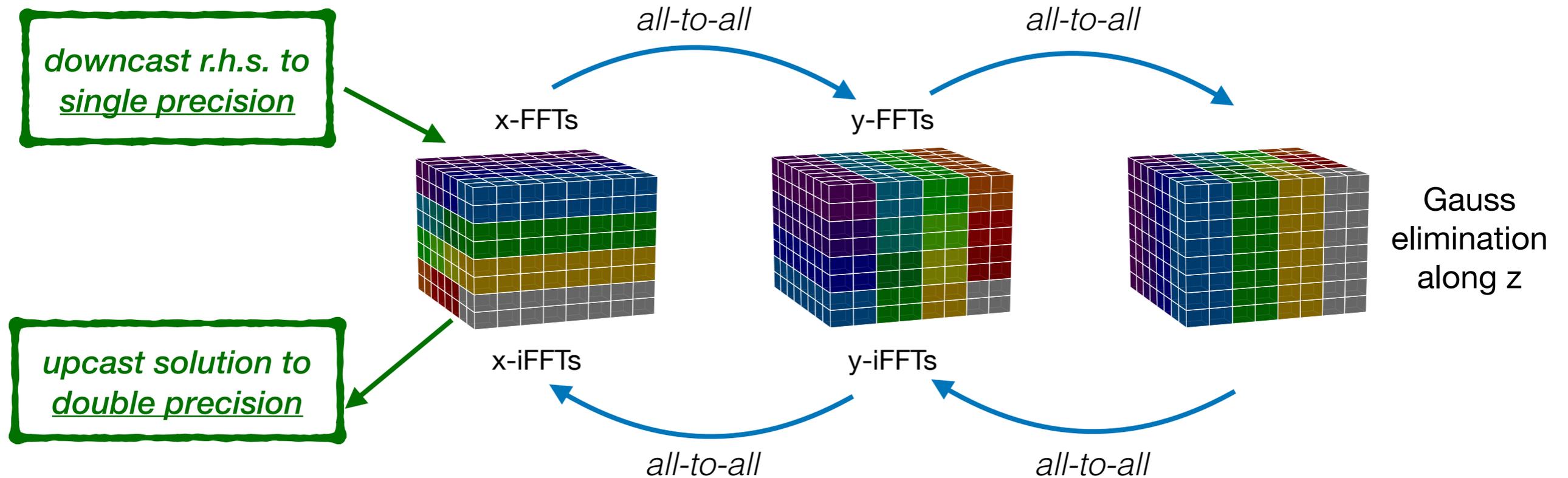
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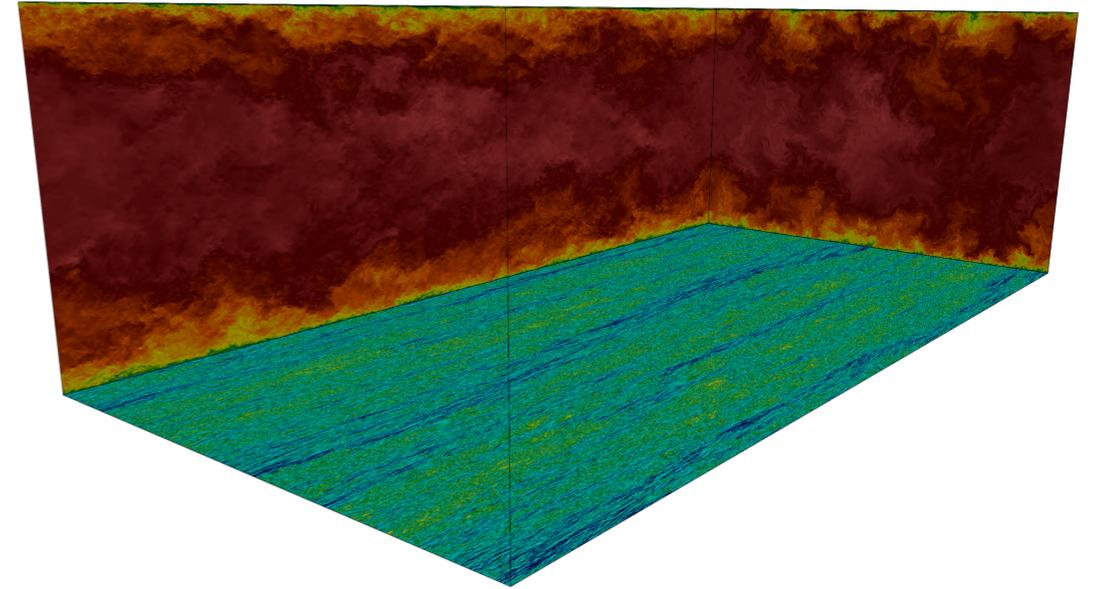
beyond mixed precision (unsuitable for very extreme scales / Reynolds numbers), can we still do better?



Poisson solver performance at scale

turbulent channel flow setup w/ implicit Z diffusion

82 billion grid points



R. Diez, J. Peeters, & P. Costa. CPC (2025)



Poisson solver performance at scale

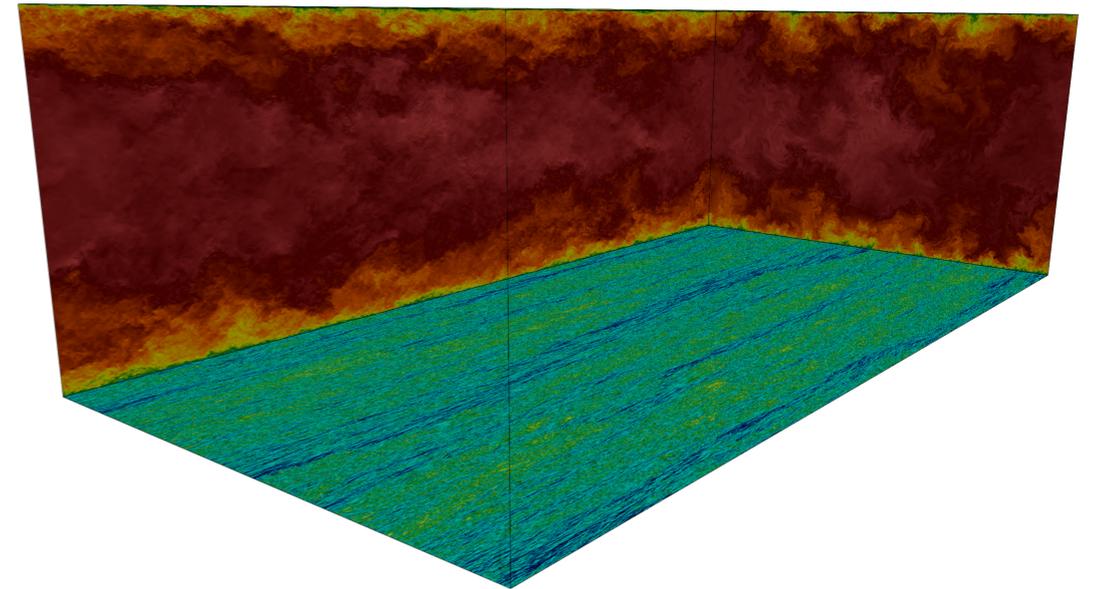
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#GPUs (nodes)	wall-time/3RK steps [s]	wall-time/3RK steps [s] (w/
256 (64)	4.02	2.56
512 (128)	2.21	1.34
1024 (256)	1.22	0.78

$$t_w N_{GPU} / (N_x N_y N_z) \approx 8 \text{ ns}$$



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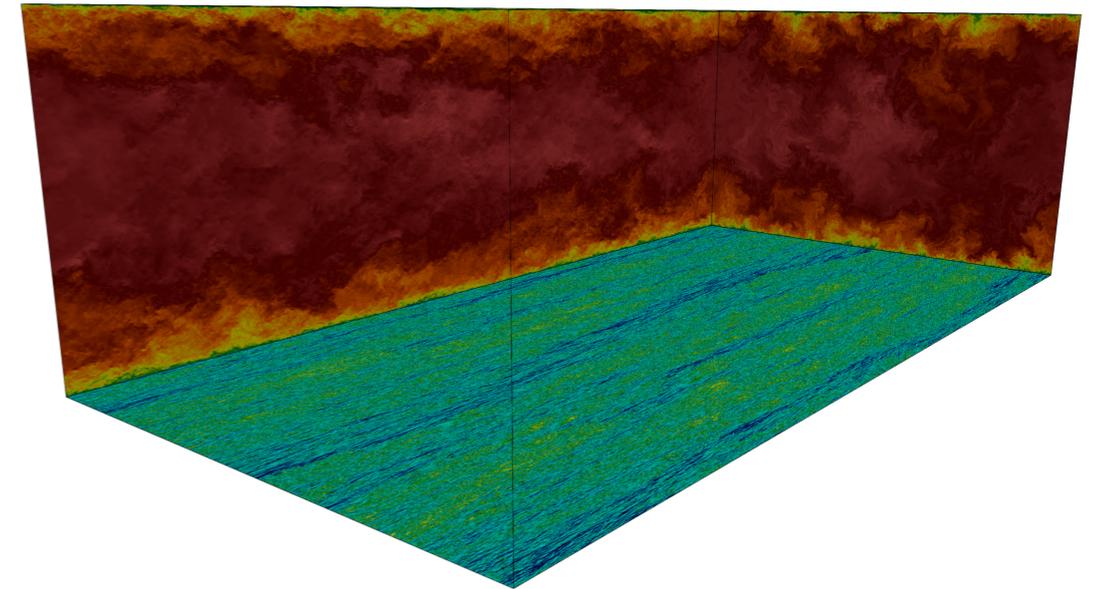
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LUMI

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$$t_w N_{GPU} / (N_x N_y N_z) \approx 17 \text{ ns} (\sim 2.1\text{x slower w.r.t. Leonardo})$$



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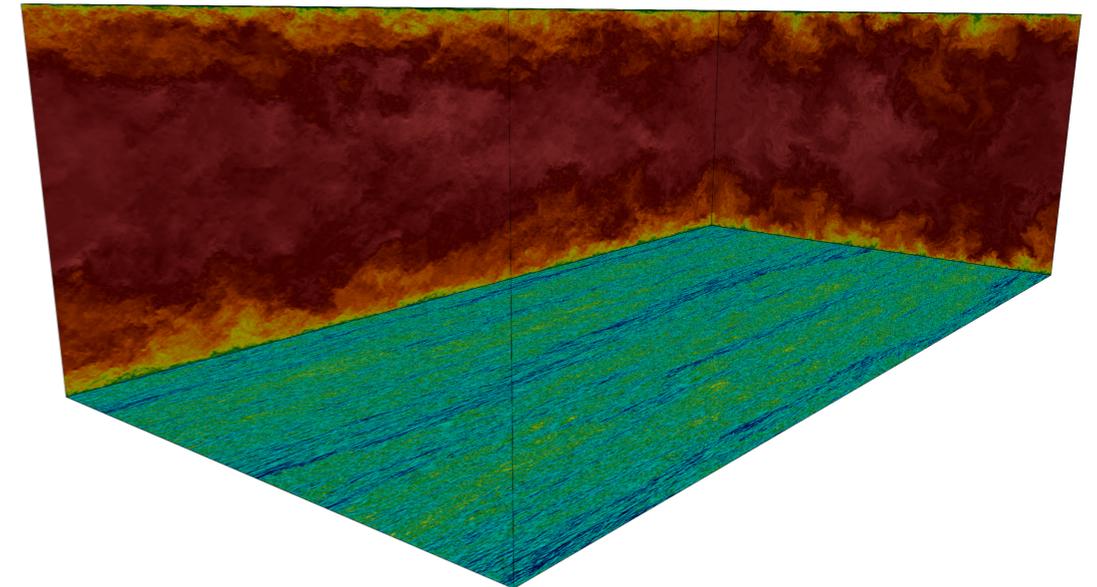
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- ▶ **Leonardo** — speedup w/ PCR-TDMA of 2x in the Poisson solver; 1.6x in the overall numerical algorithm
- ▶ **LUMI** — lower speedup w/ PCR-TDMA due to poor transpose performance (higher latency & computational overhead)
- ▶ **normalised wall time** on saturated GPUs — CaNS ~2x faster on Leonardo than LUMI

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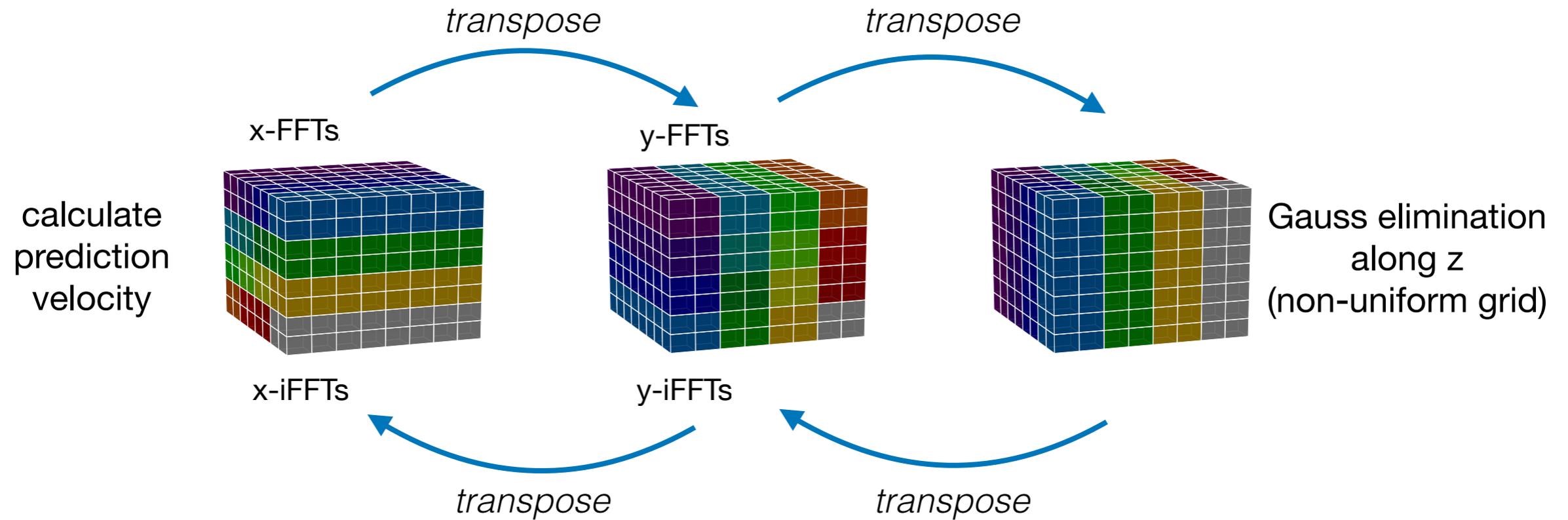


so far, we are limited to non-uniform grids along one direction
(e.g., canonical flows with at most one inhomogeneous direction)

can we **generalize the approach to non-uniform grids along all directions** ?



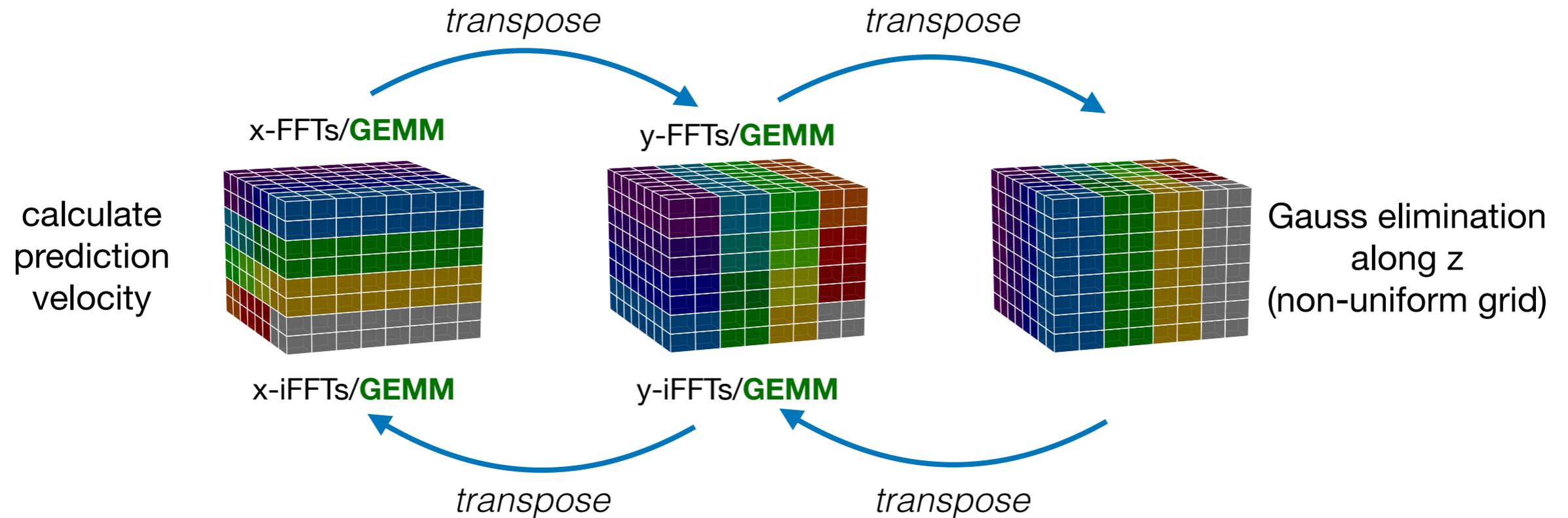
recent work — extension of fast direct solver for non-uniform grids along all directions



D. Palancha, J. Romero, M. Fatica, R. Verzicco & P. Costa.
A GEMM-based fast finite-difference Poisson solver for non-uniform grids



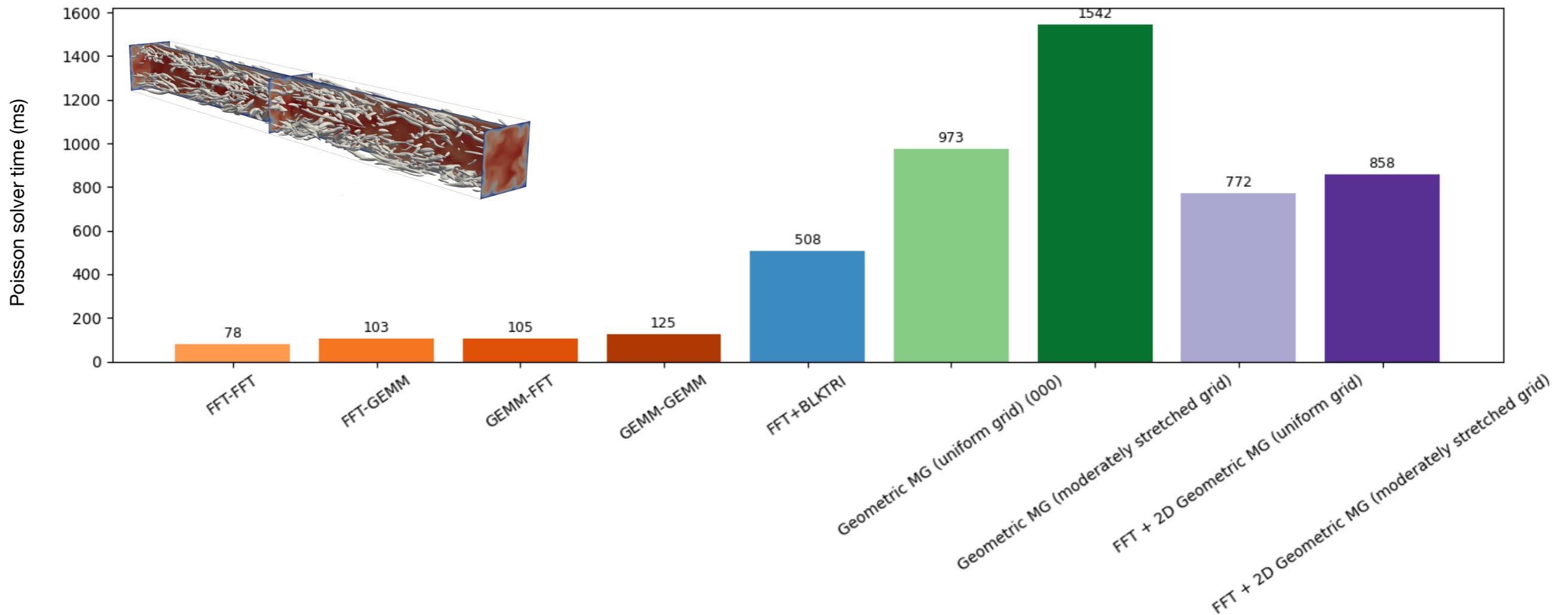
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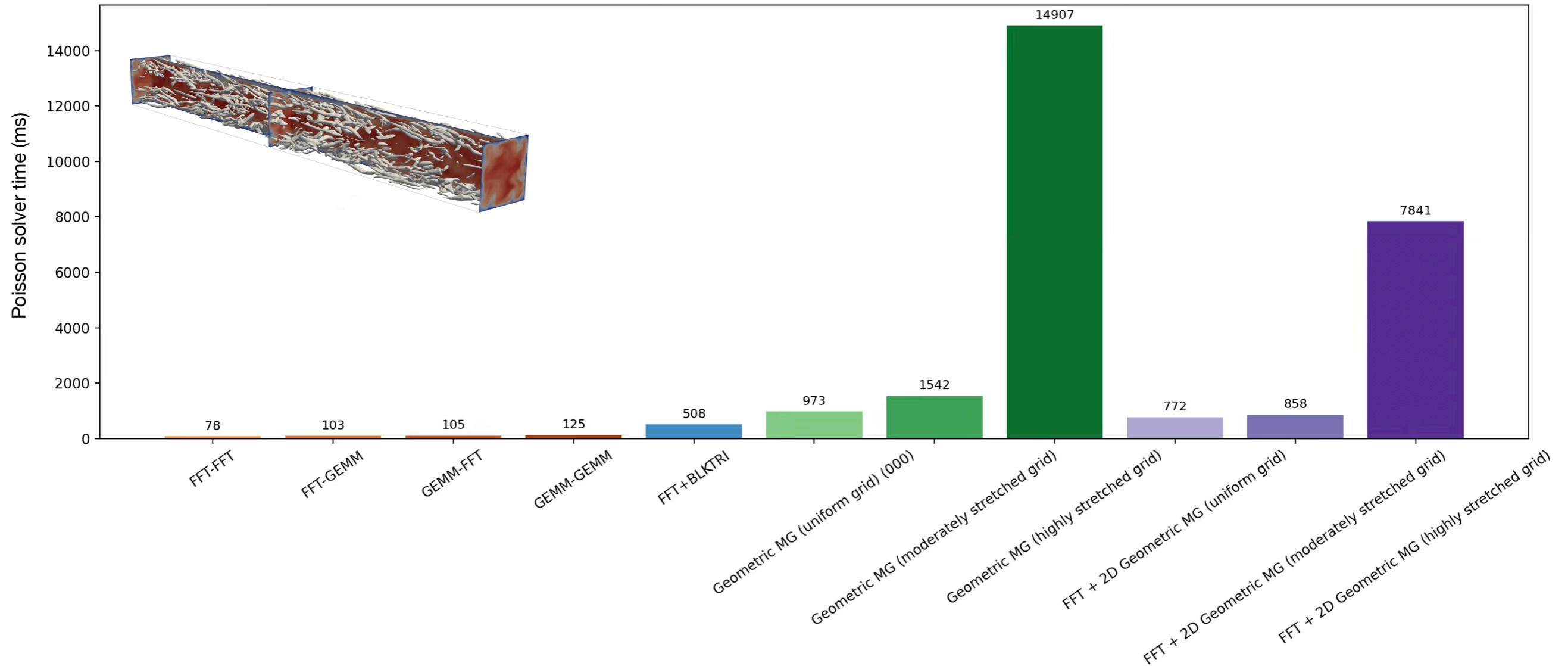
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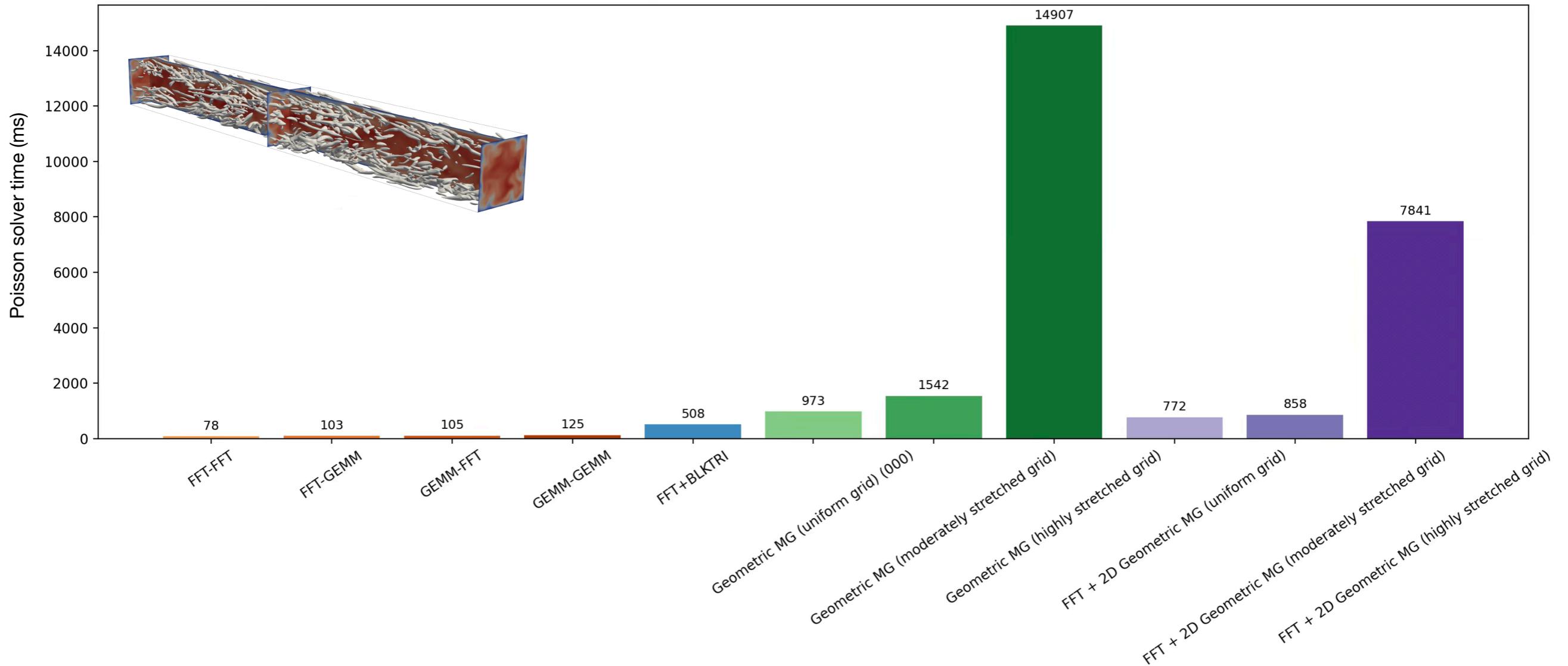
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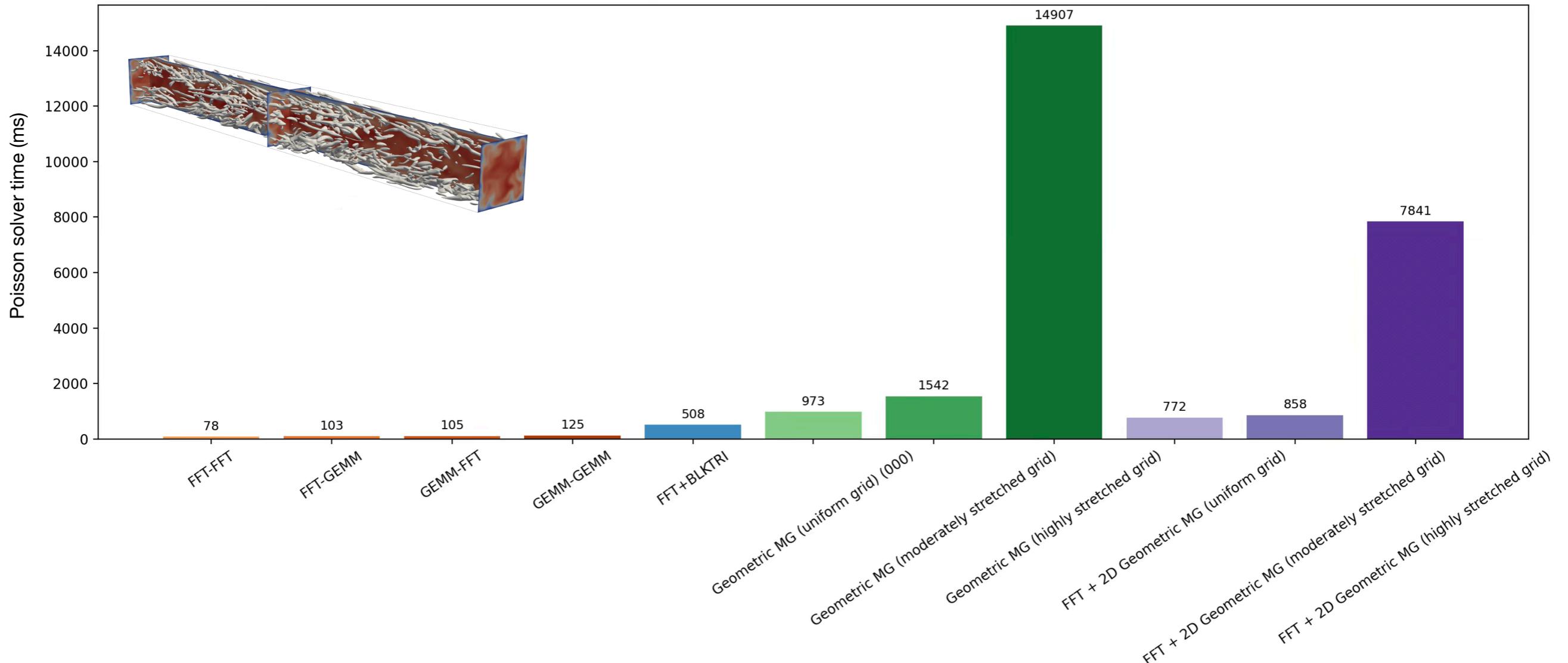


GEMM among the most optimized operations on GPUs, thanks to AI!

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wall-clock time for a Poisson solve on a GH200 supership 2048x512x512: ~ 0.1 – 0.2s per billion grid cells

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conclusions & outlook

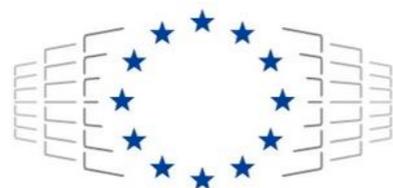
- leveraging the exascale era is hard, but we can do so much more after breaking the barrier of porting our tools to work on extreme-scale GPU-based systems
- running efficiently in recent architectures benefits from tailoring the numerical solver in all three fronts — numerical method, computational algorithm, and implementation strategy
- new FFT/GEMM-based Poisson solver enable fast DNS in cartesian geometric with non-uniform grids along all directions — soon in new version of CaNS
- in multiphase flows, we will be soon able to perform fully-coupled simulations of phase changing multiphase flows near walls with minimal working assumptions
- all open-source (or soon-to-be), you are welcome to try it too!



conclusions & outlook

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thank you for listening!



EuroHPC
Joint Undertaking

