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# Towards petascale simulation of atmospheric circulations with soundproof equations

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# EULAG model – powerful virtual laboratory

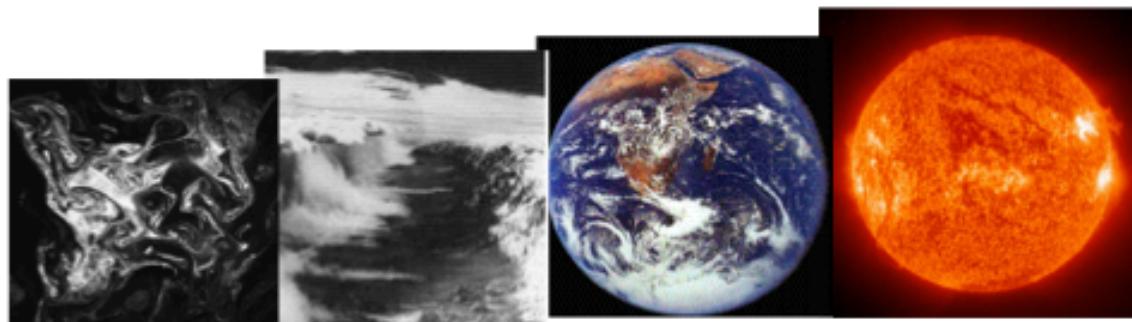


What does the application do?



NCAR

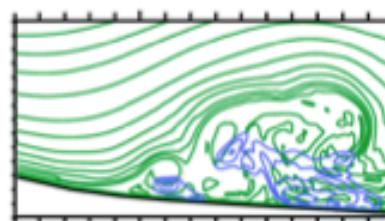
Simulating thermo-fluid flows across a range of scales and physics



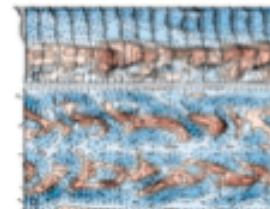
←  $\Delta x$   $O(10^{-2})$  m  $O(10^2)$  m  $O(10^4)$  m  $O(10^7)$  m →



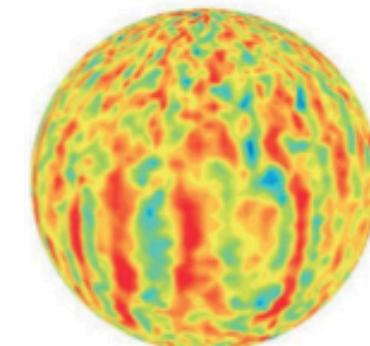
Cloud turbulence



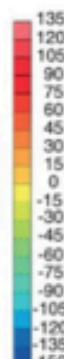
Gravity waves



Global flows

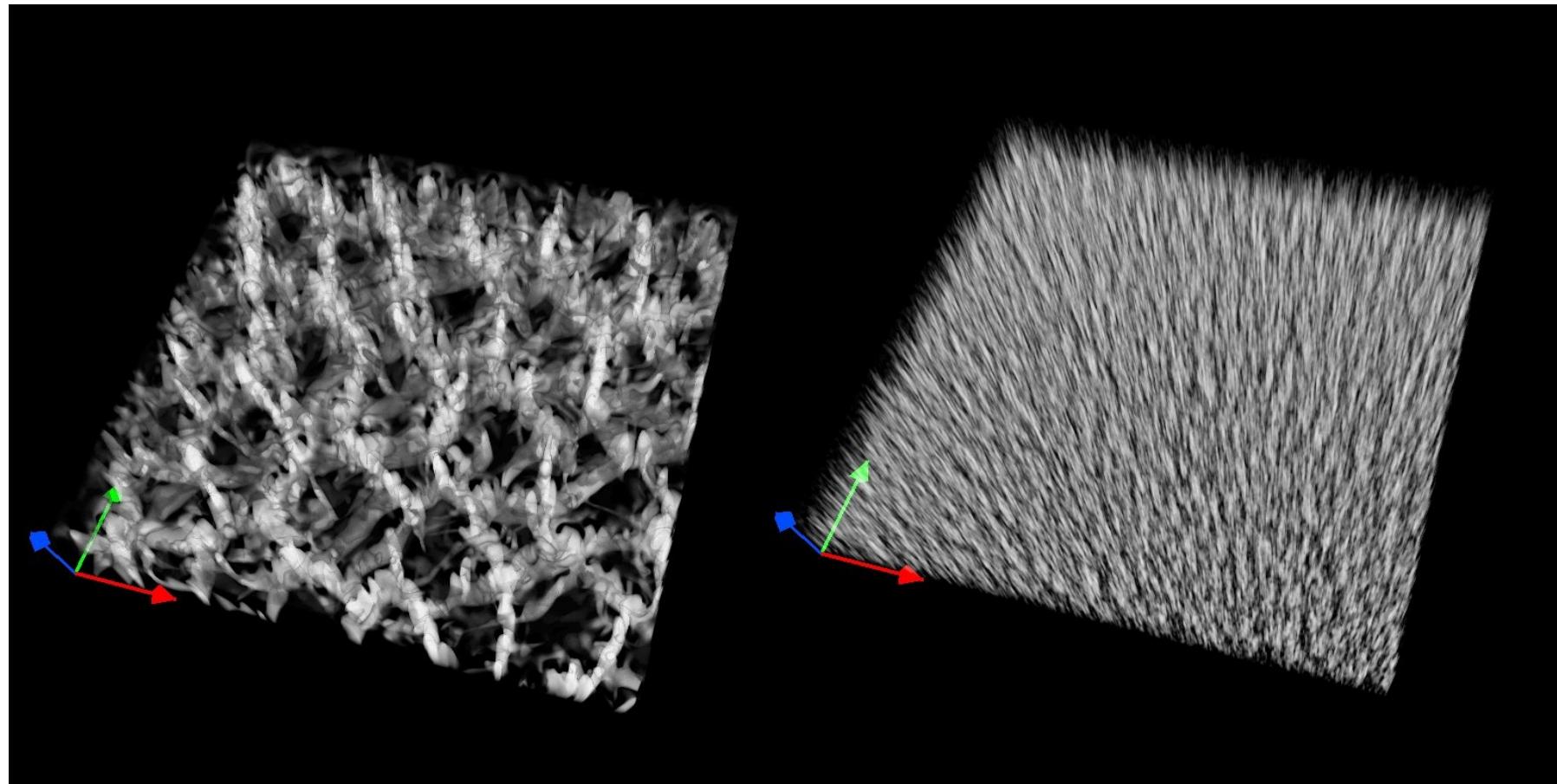


Solar convection



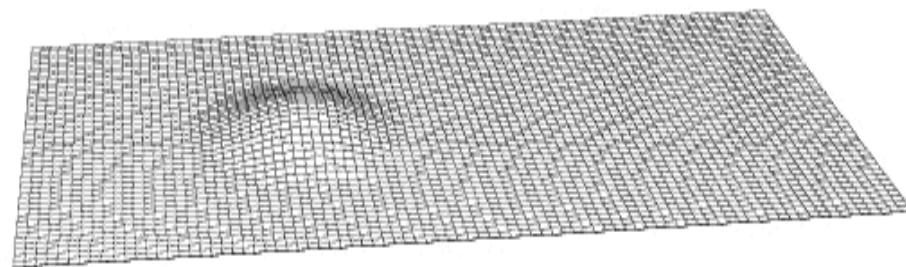
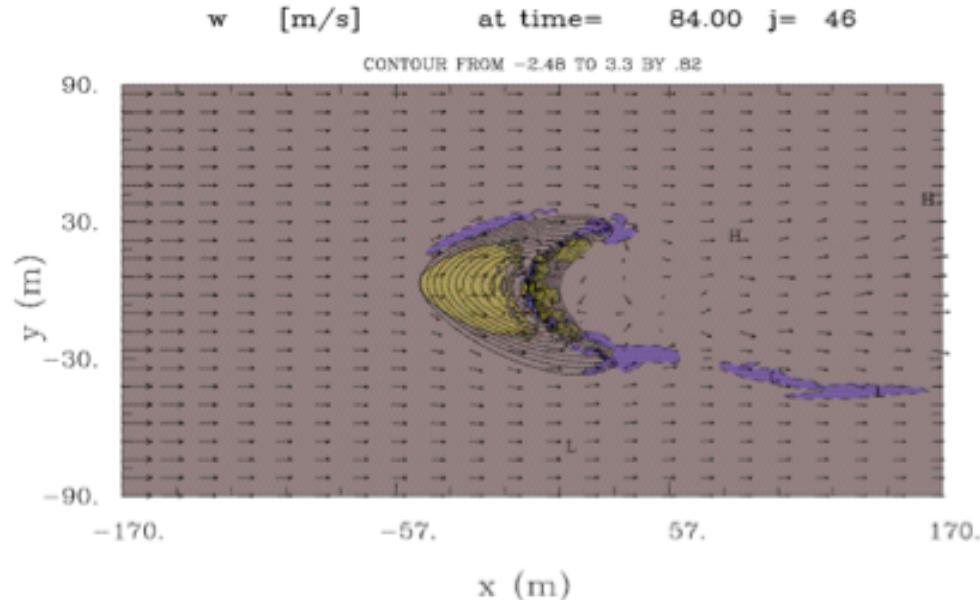
## Examples of applications

Investigation of numerical realizability of idealized  
thermal convection over heated plane  
(Piotrowski et al. 2009, JCP)

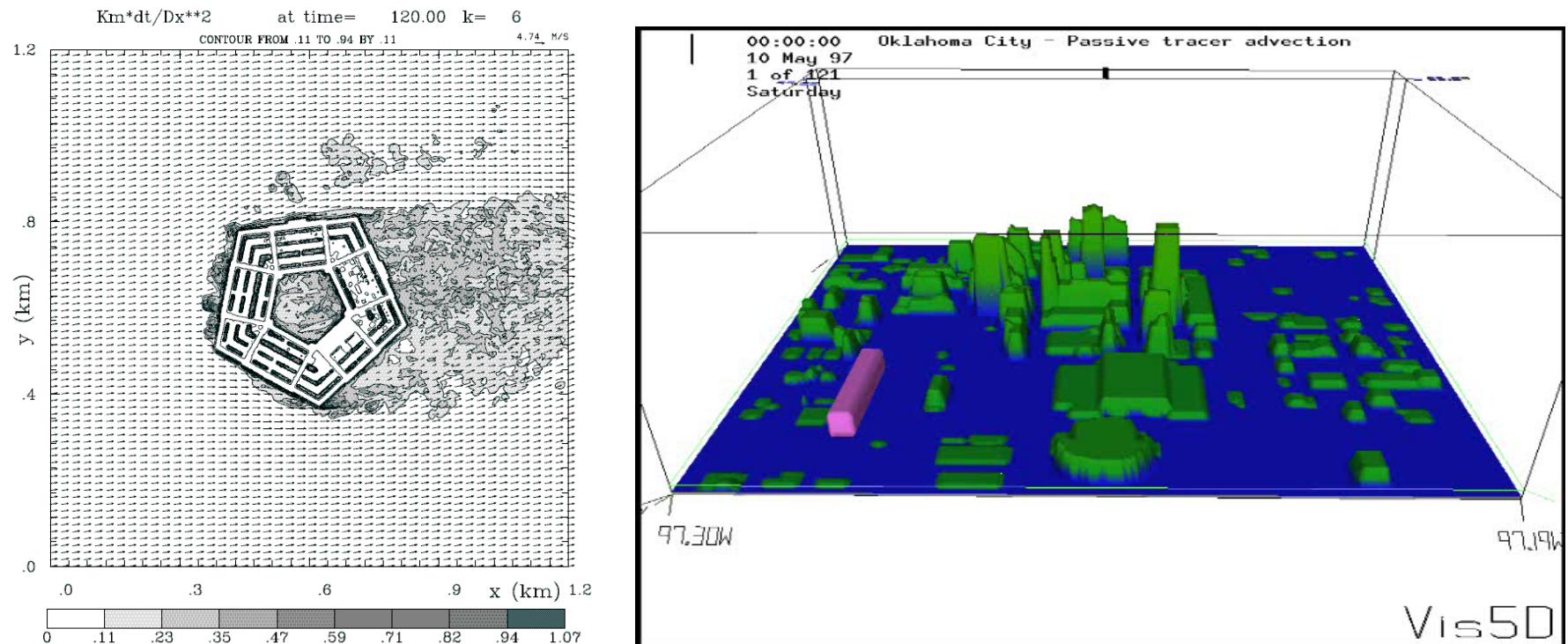


Imagery produced by VAPOR ([www.vapor.ucar.edu](http://www.vapor.ucar.edu)), a product of NCAR

Simulations of boundary layer flows past rapidly evolving sand dunes  
LES, with all relevant sub-grid scales parameterized  
(Ortiz et al 2009, Phys. Rev.)

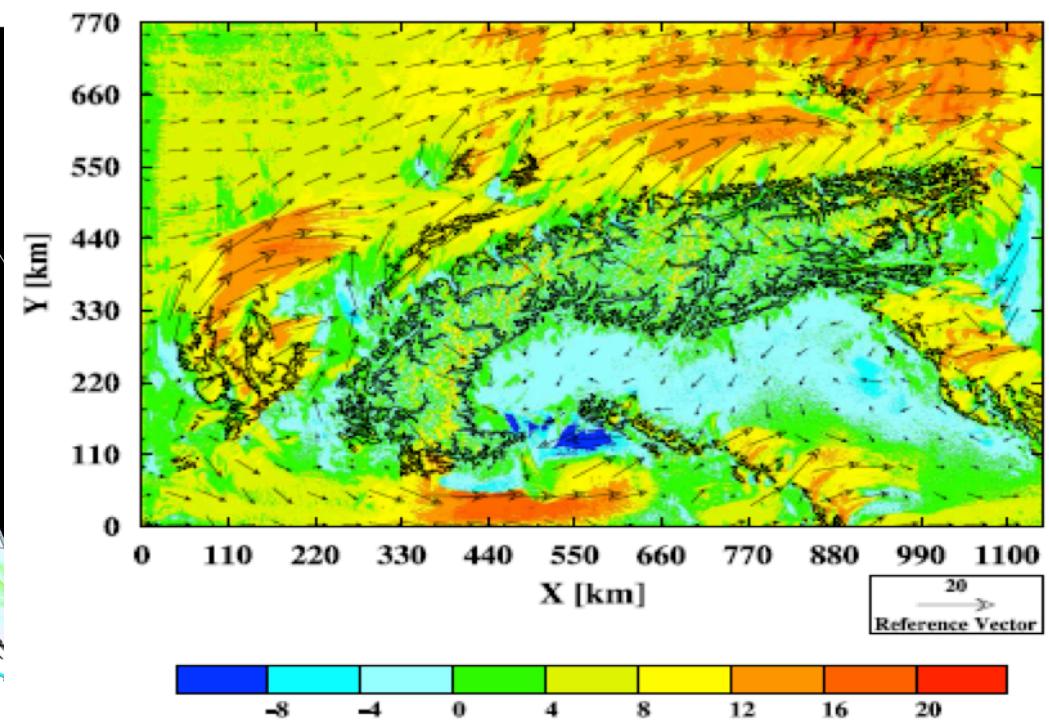
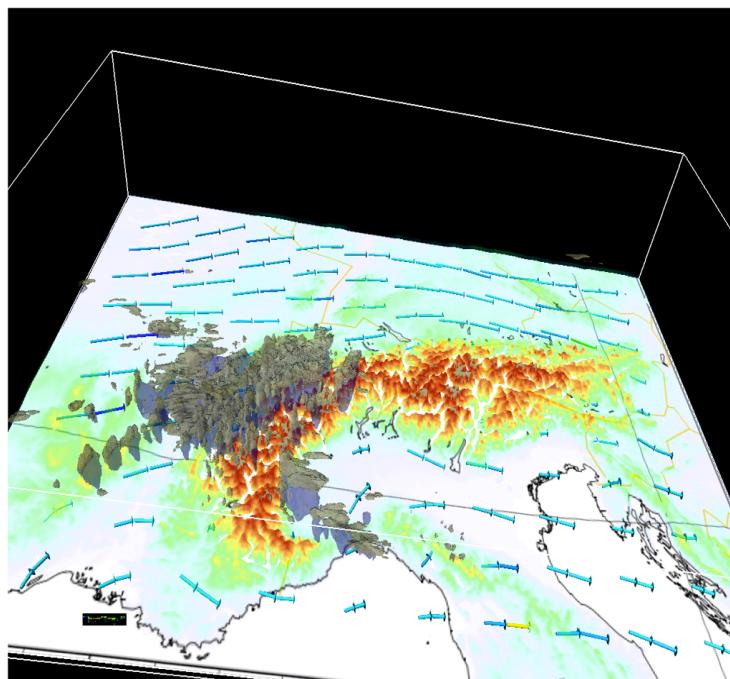


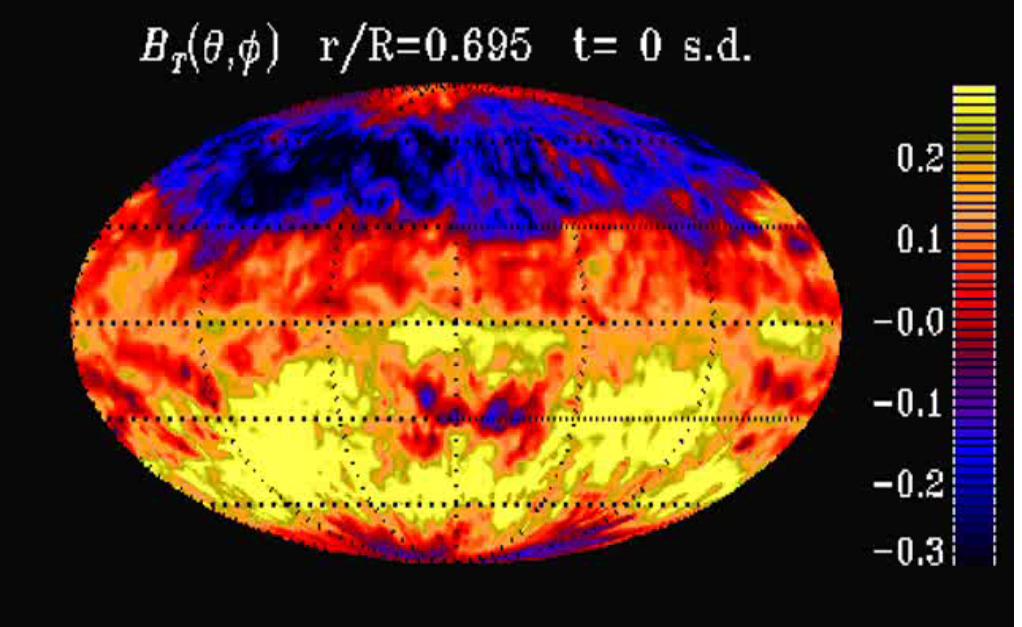
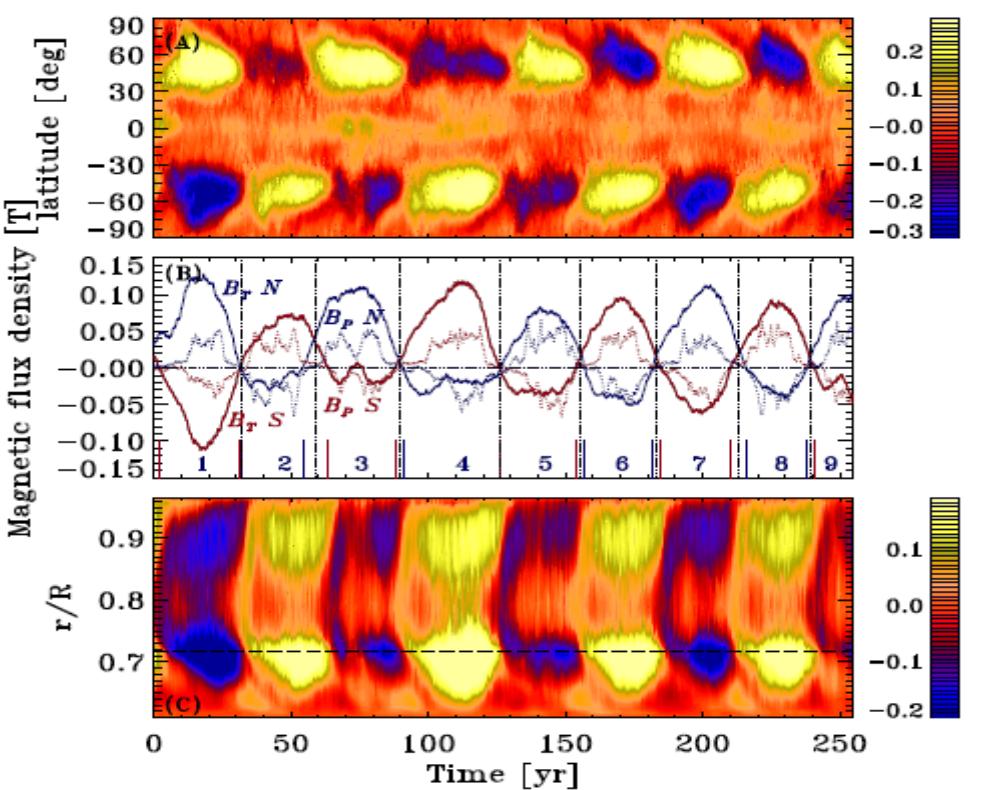
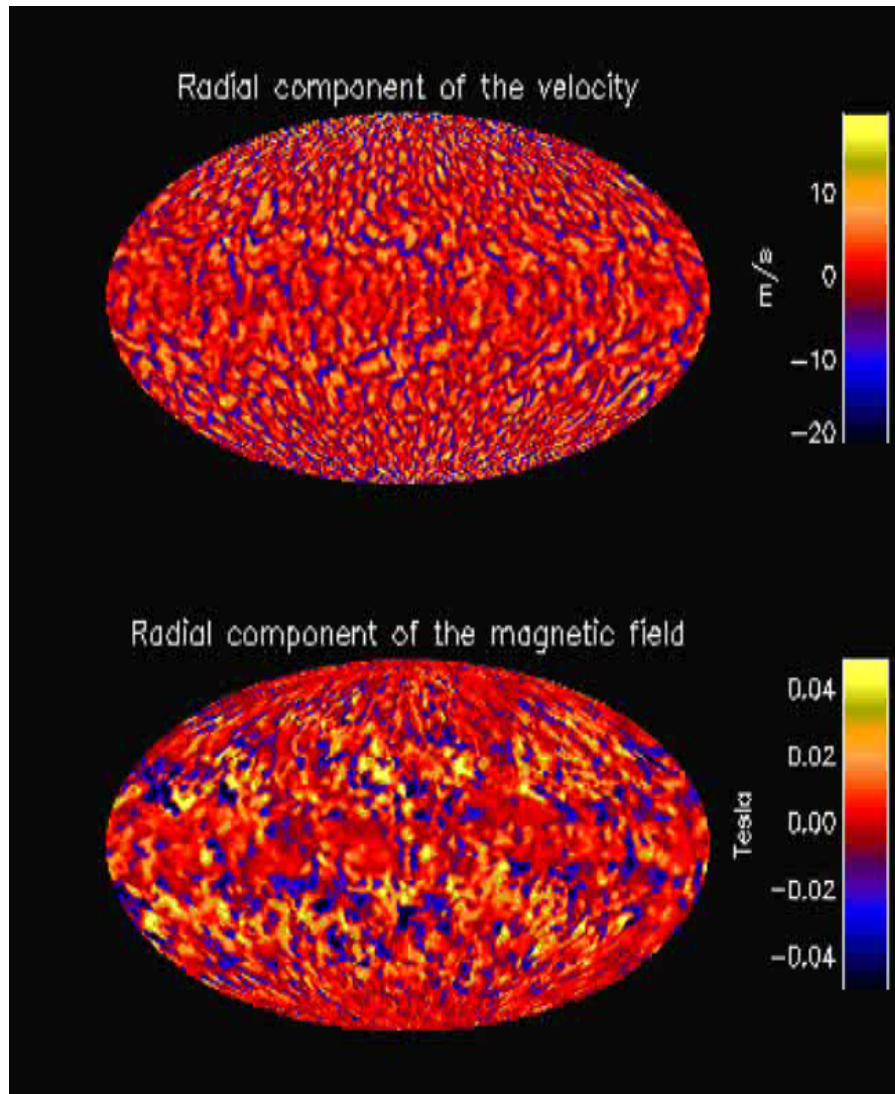
# Urban planetary boundary layer



(Smolarkiewicz et al. 2007, *JCP*)

# Prospective dynamical core for high resolution COSMO consortium regional NWP over Europe (Ziemiański et al. 2011, Acta Geoph.)





Toroidal component of B in the uppermost portion of the stable layer underlying the convective envelope at  $r/R \approx 0.7$  →

# Scientific approach

Two fundamental algorithms: MPDATA advection + GCRK pressure solver

Two optional modes for integrating fluid PDEs:

- Eulerian --- control-volume wise integral
- Lagrangian --- trajectory wise integral

Optional fluid equations (nonhydrostatic):

- Anelastic
- Compressible/incompressible Boussinesq
- Incompressible Euler/Navier-Stokes'
- Fully compressible for high-speed flows
- Anelastic MHD
- Anelastic for unstructured grid formulation

Available strategies for simulating turbulent dynamics:

- Direct numerical simulation (DNS)
- Large-eddy simulation, explicit and implicit (LES, ILES)

## Multidimensional positive definite advection transport algorithm (MPDATA).

→ Starts with iteration of upwind scheme, then applies nonlinear corrective iterations of upwind with negative diffusion

$$\frac{\partial \phi}{\partial t} = -\nabla \bullet (\mathbf{V} \phi) , \quad \phi_i^{n+1} = \phi_i^n - \frac{\delta t}{\mathcal{V}_i} \sum_{j=1}^{l(i)} F_j^\perp S_j$$

$$F_j^\perp(\phi_i, \phi_j, V_j^\perp) = [V_j^\perp]^+ \phi_i + [V_j^\perp]^- \phi_j , \quad [V]^+ \equiv 0.5(V + |V|) , \quad [V]^- \equiv 0.5(V - |V|) ,$$

$$\phi_i^{(k)} = \phi_i^{(k-1)} - \frac{\delta t}{\mathcal{V}_i} \sum_{j=1}^{l(i)} F_j^\perp \left( \phi_i^{(k-1)}, \phi_j^{(k-1)}, V_j^{\perp,(k)} \right) S_j$$

with  $k = 1, \dots, IORD$  such that

$$\phi^{(0)} \equiv \phi^n ; \quad \phi^{(IORD)} \equiv \phi^{n+1}$$

$$V^{\perp,(k+1)} = V^\perp \left( \mathbf{V}^{(k)}, \phi^{(k)}, \nabla \phi^{(k)} \right) ; \quad V_j^{\perp,(1)} \equiv V^\perp|_j^{n+1/2}$$

$$V^\perp|_{s_j}^{(k+1)} = \left\{ 0.5|V^\perp| \left( \frac{1}{|\phi|} \frac{\partial |\phi|}{\partial r} \right) (r_j - r_i) - 0.5V^\perp \left( \frac{1}{|\phi|} \frac{\partial |\phi|}{\partial r} \right) (r_i - 2r_{s_j} + r_j) \right. \\ \left. - 0.5\delta t V^\perp \left( \mathbf{V} \bullet \frac{1}{|\phi|} \nabla |\phi| \right) - 0.5\delta t V^\perp (\nabla \bullet \mathbf{V}) \right\}|_{s_j}^{(k)}$$



# Numerical design

All principal forcings are assumed to be unknown at  $n+1$

$$\psi_{\mathbf{i}}^{n+1} = LE_{\mathbf{i}}(\psi^n + 0.5\Delta t R^n) + 0.5\Delta t R_{\mathbf{i}}^{n+1}$$

$\Rightarrow$  system implicit with respect to all dependent variables.

On grids co-located with respect to all prognostic variables, it can be inverted algebraically to produce an elliptic equation for pressure

$$\left\{ \frac{\Delta t}{\rho^*} \bar{\nabla} \cdot \rho^* \tilde{\mathbf{G}}^T [\hat{\mathbf{v}} - (\mathbf{I} - 0.5\Delta t \hat{\mathbf{R}})^{-1} \tilde{\mathbf{G}}(\bar{\nabla} \pi'')] \right\}_{\mathbf{i}} = 0$$

*solenoidal velocity*  $\bar{\mathbf{v}}^s \equiv \bar{\mathbf{v}}^* - \frac{\partial \bar{\mathbf{x}}}{\partial t}$  *contravariant velocity*  $\bar{\mathbf{v}}^* \equiv d\bar{\mathbf{x}}/d\bar{t} \equiv \dot{\bar{\mathbf{x}}}$

$$\tilde{\mathbf{G}}^T [\hat{\mathbf{v}} - (\mathbf{I} - 0.5\Delta t \hat{\mathbf{R}})^{-1} \tilde{\mathbf{G}}(\bar{\nabla} \pi'')] \equiv \bar{\mathbf{v}}^s$$

Boundary conditions on  $\pi''$  Imposed on  $\bar{\mathbf{v}}^s \bullet \mathbf{n}$  subject to the integrability condition

$$\int_{\partial\Omega} \rho^* \bar{\mathbf{v}}^s \bullet \mathbf{n} d\sigma = 0$$

Boundary value problem is solved using nonsymmetric Krylov subspace solver - a preconditioned generalized conjugate residual GCR( $k$ ) algorithm  
 (Smolarkiewicz and Margolin, 1994; Smolarkiewicz et al., 2004)

## Programming Model

- Fortran 77 (fixed form ...)
- Model fits in one file
- C-shell preprocessor

## Parallel features

- Two or three dimensional decomposition with MPI
- Libraries in parallel mode: serial and parallel Netcdf, Vis5d
- Currently run on Bluegene/L, POWER 6, Cray XT4, XT5, XE6, Linux clusters, PC workstations, etc.
- Performance testing with Tau, Scalasca, CrayPat

# Eulag parallelization history

**1996-1998:** compiler parallelization on NCAR's vector Crays J90

**1996-1997:** first MPP (PVM)/SMP (SHMEM) version at NCAR's Cray T3D  
based on 2D domain decomposition (Anderson)

**1997-1998:** extension to MPI, removal of PVM (Wyszogrodzki )

**2004:** attempt to use OpenMP (Andrejczuk)

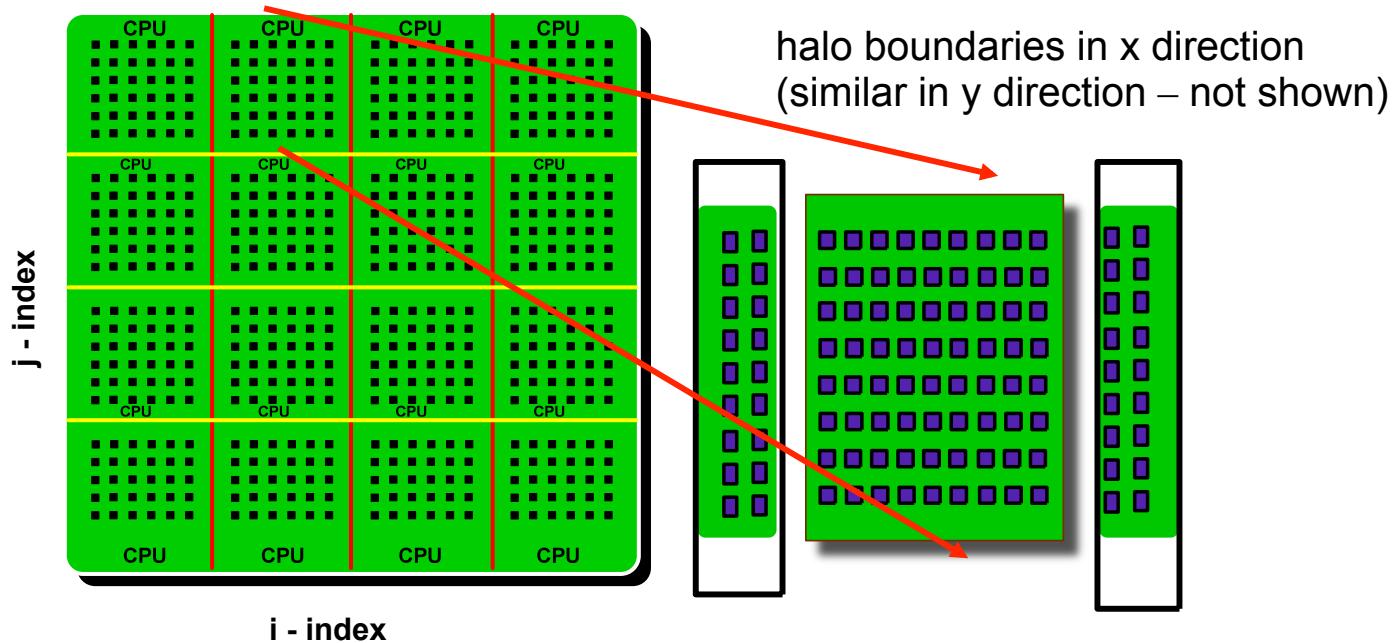
**2009-** : development of GPU/OpenCL version (Rojek, Szustak, Kurowski)

**2010-2011:** extending 2D decomposition to 3D MPP (Piotrowski & Wyszogrodzki)

# Motivation for 3D parallelization with MPI

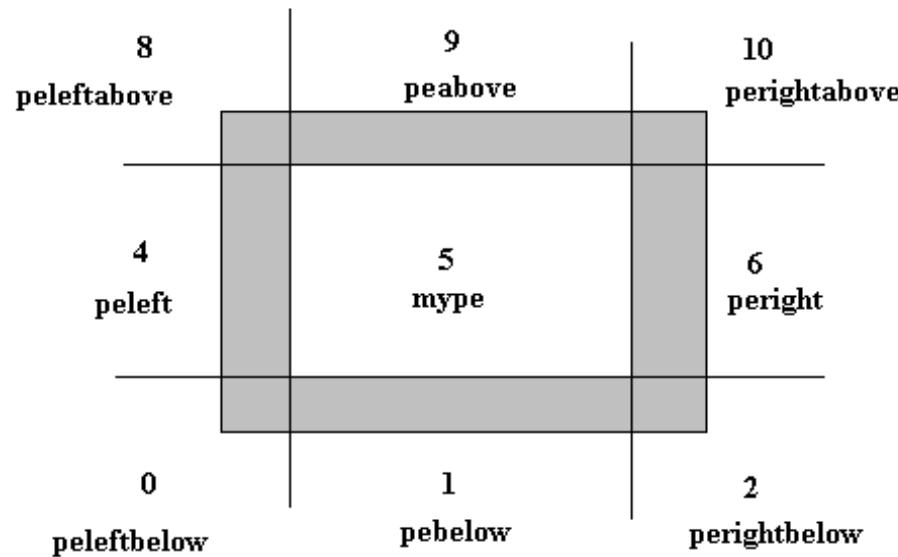
- Improve scalability properties and enable efficient use of petascale-era supercomputers
- Increase maximum number of cores used in symmetric domains, like cloud turbulence studies
- Decreasing time-to-solution for problems demanding long integration in time

# 2D-MPI data decomposition in EULAG



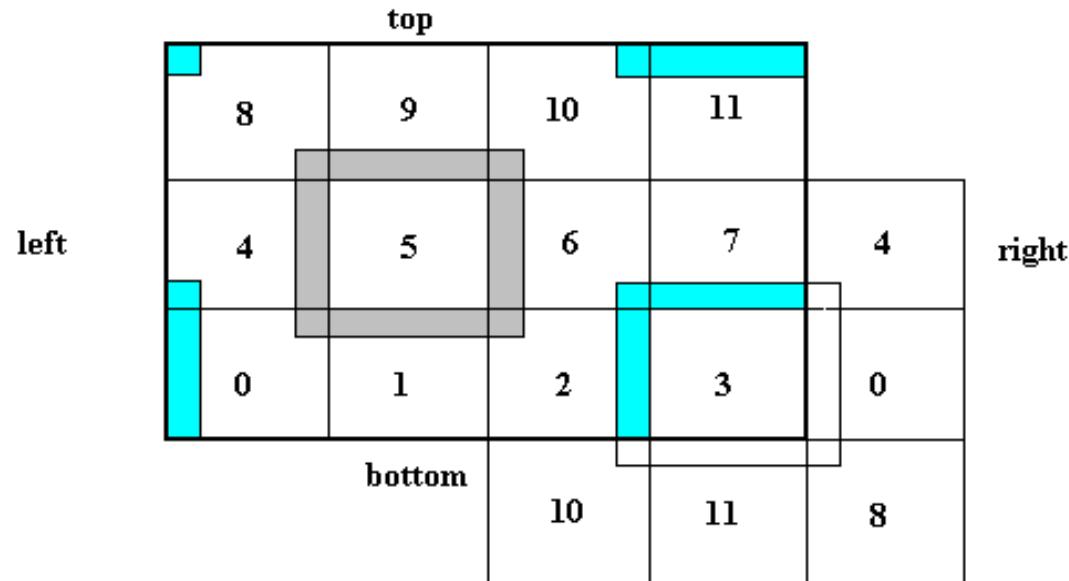
- 2D horizontal domain grid decomposition
- No decomposition in vertical Z-direction
- Halo/ghost cells for collecting information from neighbors
- Predefined halo size for array memory allocation
- Selective halo size for update to decrease overhead

# Typical processors configuration



- Computational 2D grid is mapped onto an 1D grid of processors
- Neighboring processors exchange messages via MPI
- Each processor know its position in physical space (column, row, boundaries) and location of neighbor processors

# EULAG – Cartesian grid configuration



← In the setup on the left

➤ nprocs=12

➤ nprocx = 4, nprocy = 3

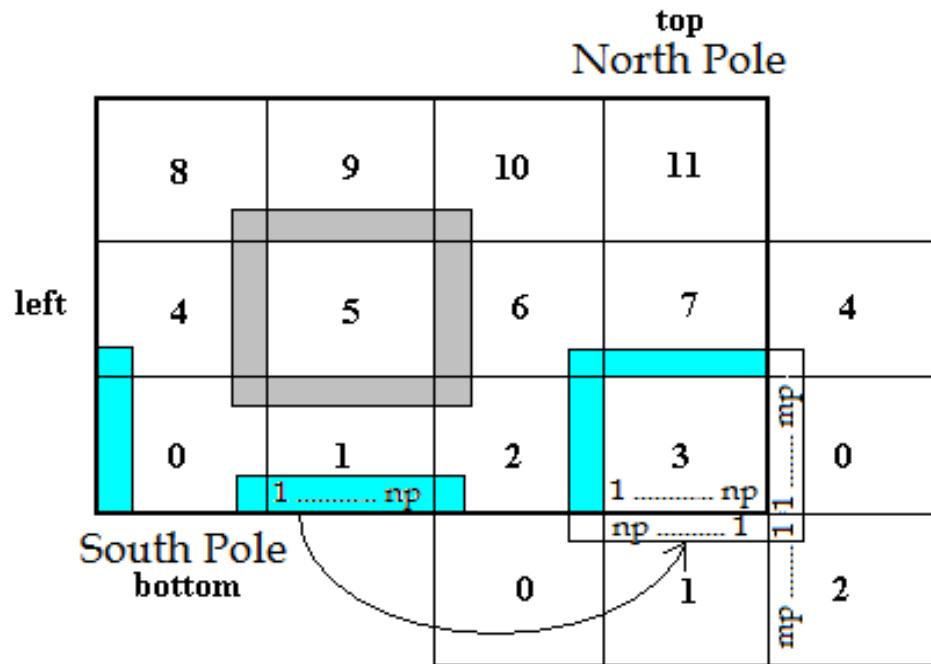
➤ if np=11, mp=11

then full domain size is

$N \times M = 44 \times 33$  grid points

- Parallel subdomains ALWAYS assume that grid has cyclic BC in both X and Y !!!
- In Cartesian mode, the grid indexes are in range: 1...N, only N-1 are independent !!!
- $F(N)=F(1) \rightarrow$  periodicity enforcement
- N may be even or odd number but it must be divided by number of processors in X
- The same apply in Y direction.

# EULAG Spherical grid configuration with data exchange across the poles



- ← In the setup on the left

- nprocs=12

- nprocx = 4, nprocy = 3

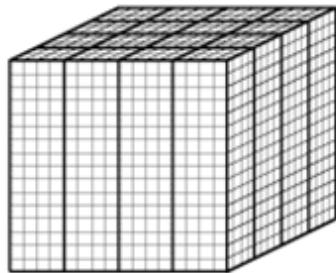
- if  $np=16$ ,  $mp=10$

then full domain size is

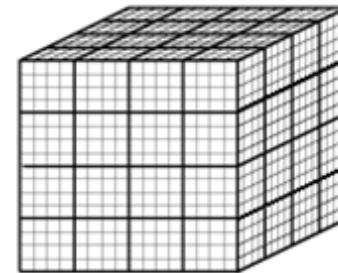
**N x M = 64 x 30 grid points**

- Parallel subdomains in longitudinal direction ALWAYS assume grid in cyclic BC !!!
  - At the poles processors must exchange data with appropriate across the pole processor.
  - In Spherical mode, there is N independent grid cells  $F(N) \neq F(1)$  ... required by load balancing and simplified exchange over the poles -> no periodicity enforcement
  - At the South (and North) pole grid cells are placed at  $\Delta y / 2$  distance from the pole.

## **Development of EULAG 3D *domain decomposition***



2D



3D

### ***Changes to model setup and algorithm design***

- *New processor geometry setup, option for MPI cartesian topology*
- *Halo updates in vertical direction*
- *Optimized halo updates at the cube corners (wider updates instead of many small messages )*
- *Changes in vertical grid structure for all model variables*
- *New loops structure due to differentiation and BC in vertical*

# EULAG SCALABILITY TESTS

## Weak Scaling

- Problem size/proc fixed
- Easier to see Good Performance
- Beloved of Benchmarkers, Vendors, Software Developers –Linpack, Stream, SPPM

## Strong Scaling

- Total problem size fixed.
- Problem size/proc drops with P
- Beloved of Scientists who use computers to solve problems. Protein Folding, Weather Modeling, QCD, Seismic processing, CFD

# Scalability tests

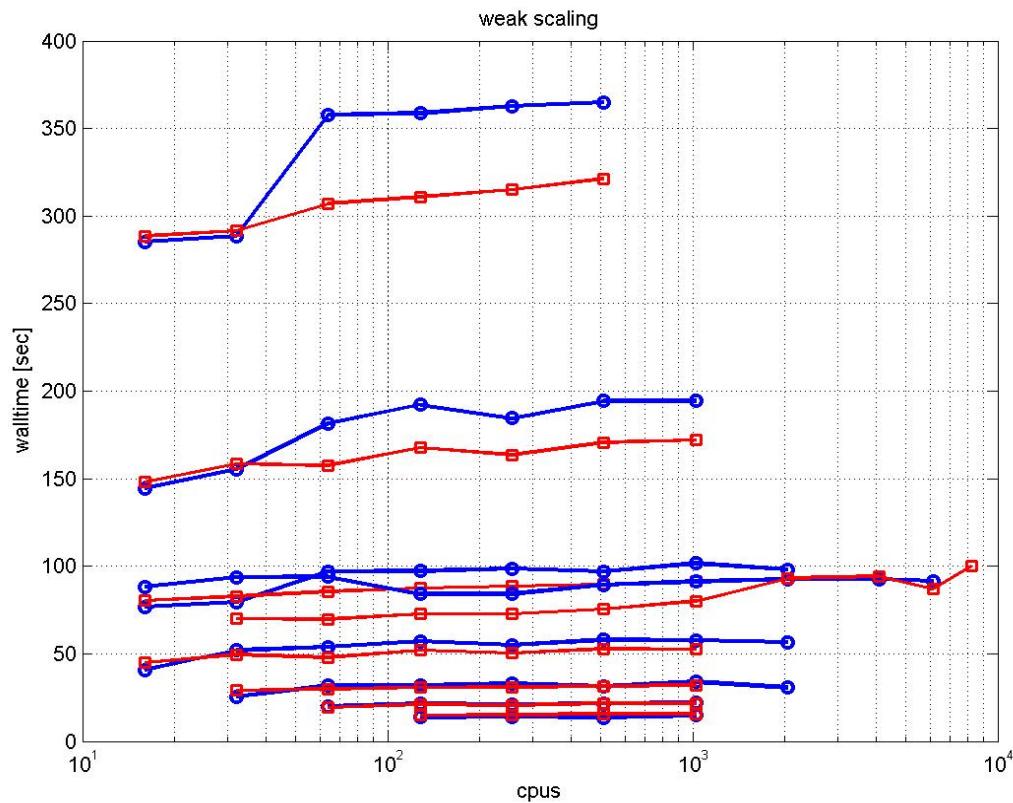
- Idealized Held-Suarez climate benchmark
- Representative for global weather/climate studies in the thin atmospheric shell – ideal candidate for 2D MPI domain decomposition



Photo: Suomi NPP

# EULAG SCALABILITY TESTS

Benchmark results from the Eulag-HS experiments  
NCAR/CU BG/L system 2048 processors (frost),  
IBM/Watson Yorktown heights BG/L ... up to 40 000 PE, only 16000 available during



Red lines – coprocessor mode, blue lines virtual mode

# EULAG SCALABILITY

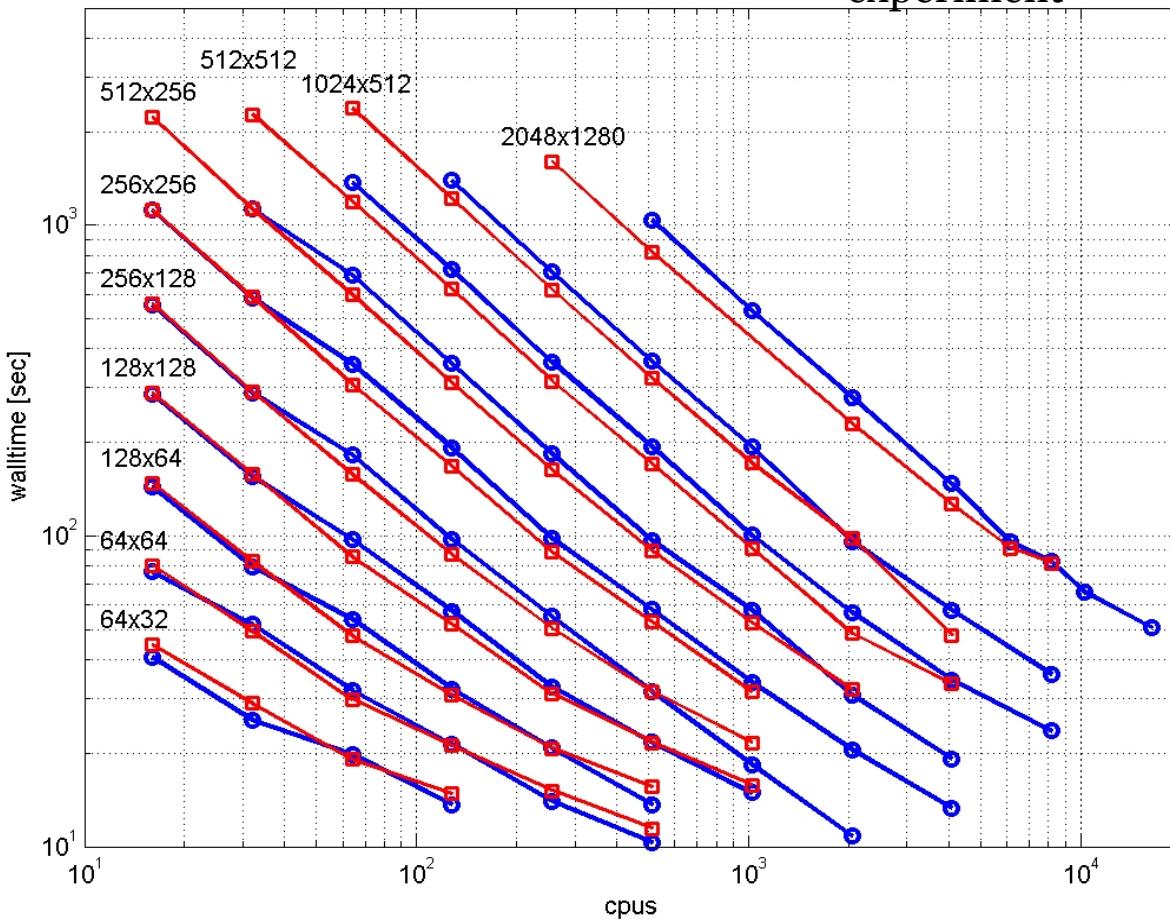
Benchmark results from the Eulag-HS experiments

NCAR/CU BG/L system 8384 processors (frost),

IBM/Watson Yorktown heights BG/W ... up to 40 000 PE, only 16000 available during

strong scaling

experiment



All curves except 2048x1280 are performed on BG/L system.

Numbers denote horizontal domain grid size, vertical grid is fixed l=41

The Elliptic solver is limited to 3 iterations (iord=3)

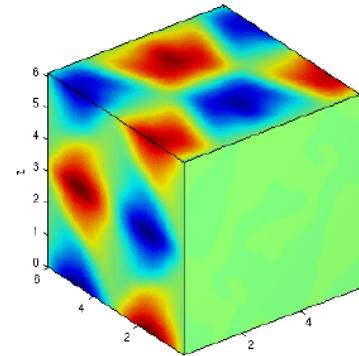
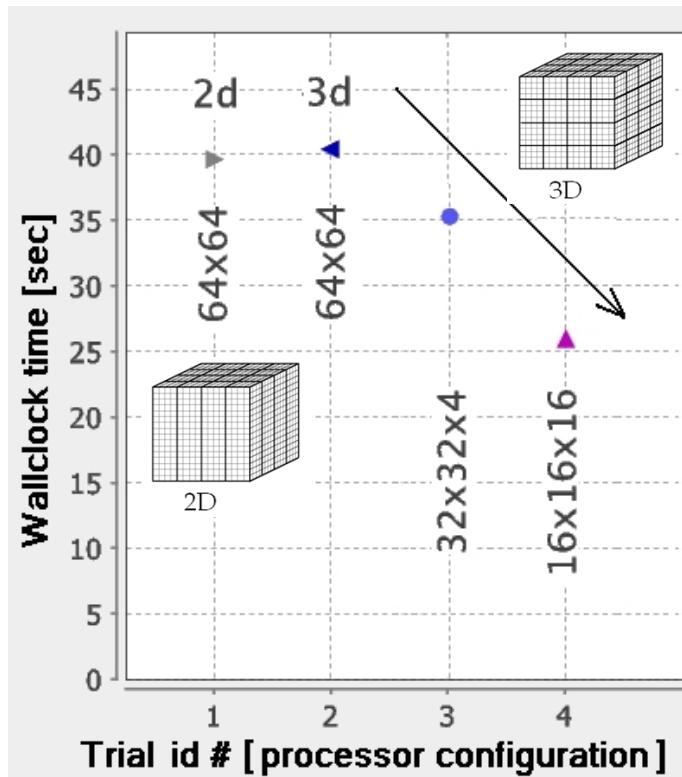
Red lines – coprocessor mode,  
blue lines virtual mode

Excellent scalability  
up to number of  
processors  $NPE = \sqrt{N \cdot M}$

## EULAG 3D domain decomposition – turbulence in a box

Taylor Green Vortex (TGV) turbulent decay.

Triple periodic cubic grid box - a perfect candidate for 3D decomposition



Only pressure solver and model initializations, no preconditioner

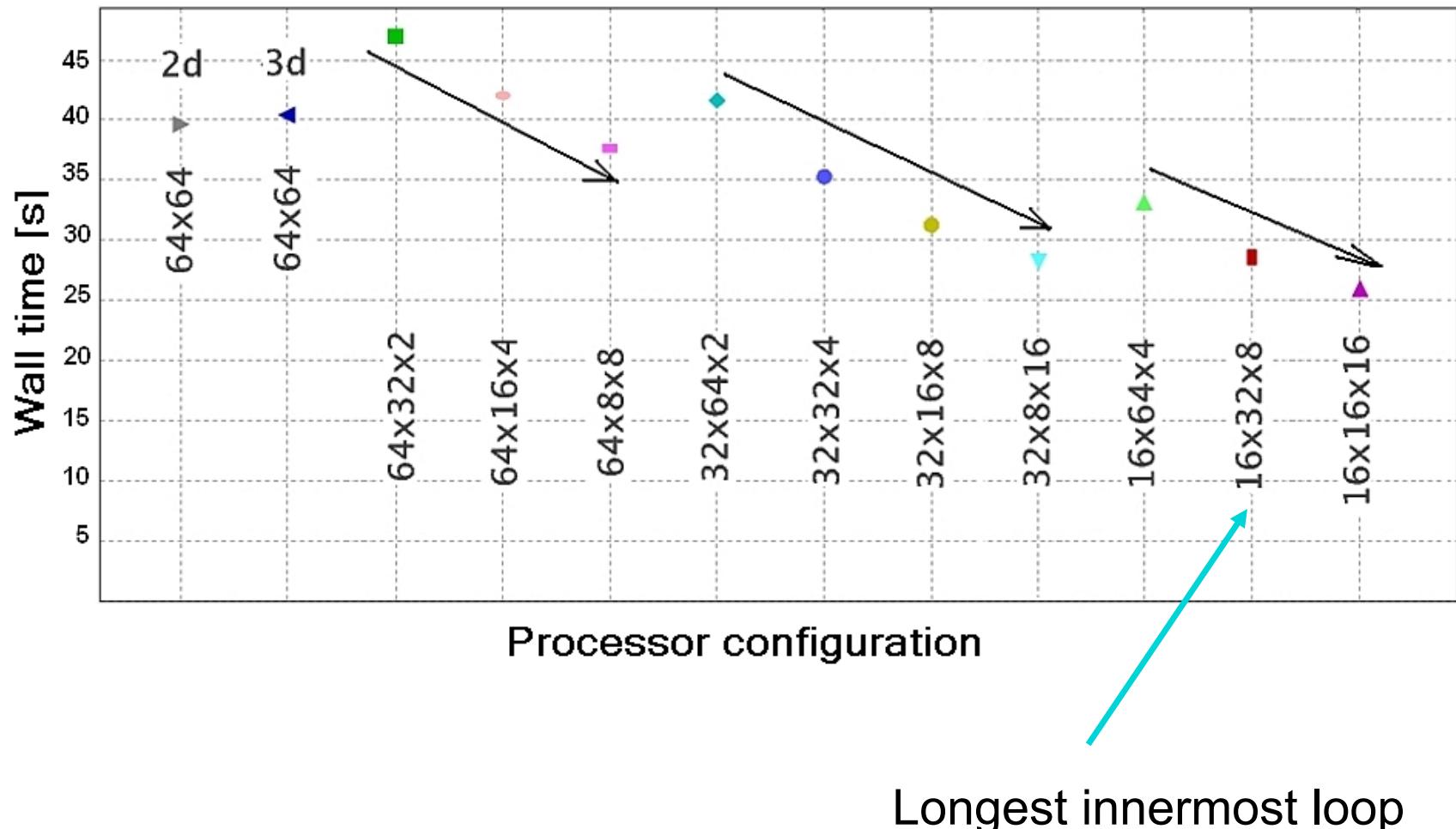
Fixed number of iterations

100 calls to solver

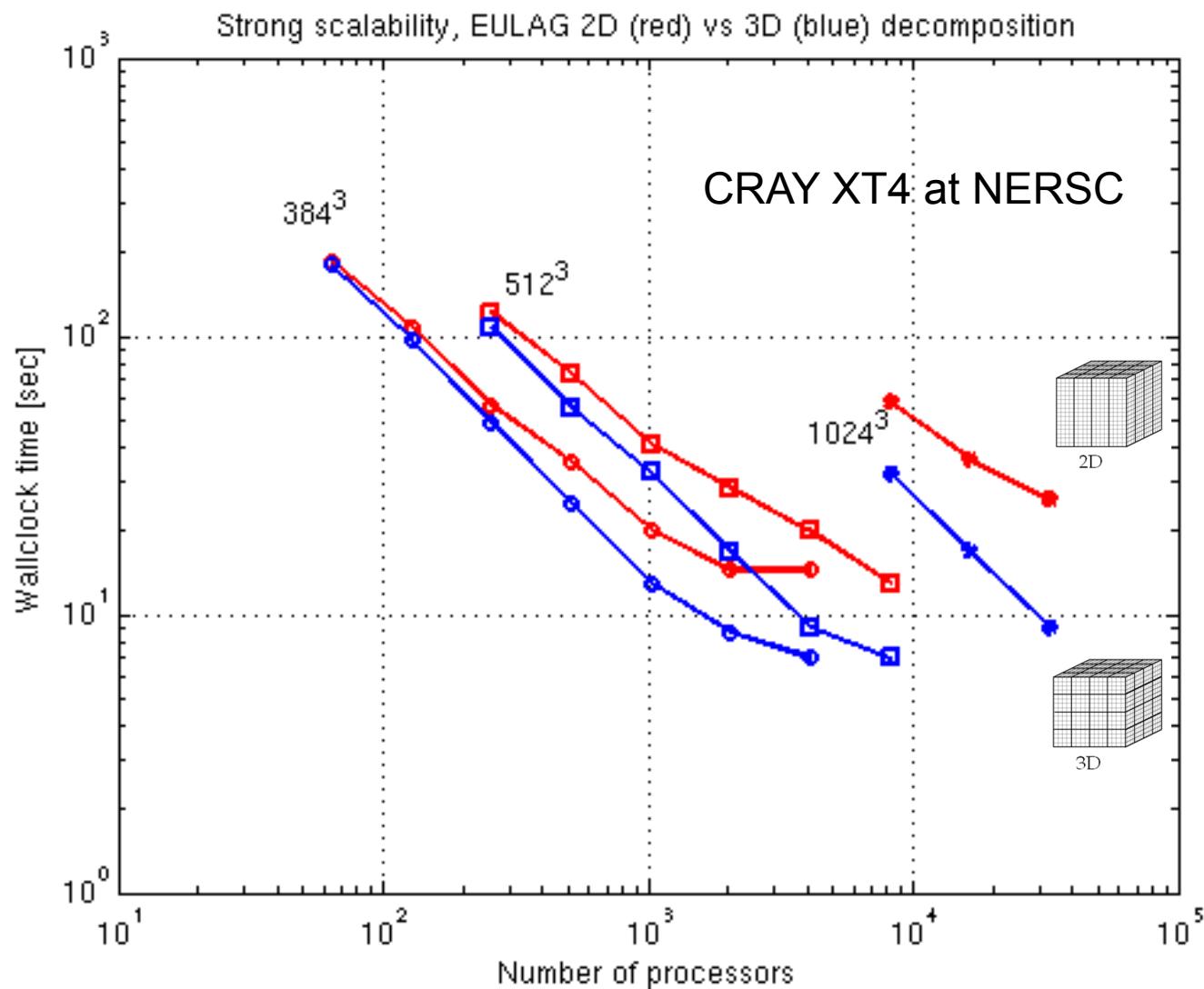
512<sup>3</sup> grid points

IBM BG/L system  
with 4096 PEs

# $512^3$ gridpoints decaying turbulence - dependence of performance on the processor configuration on Bluegene/L

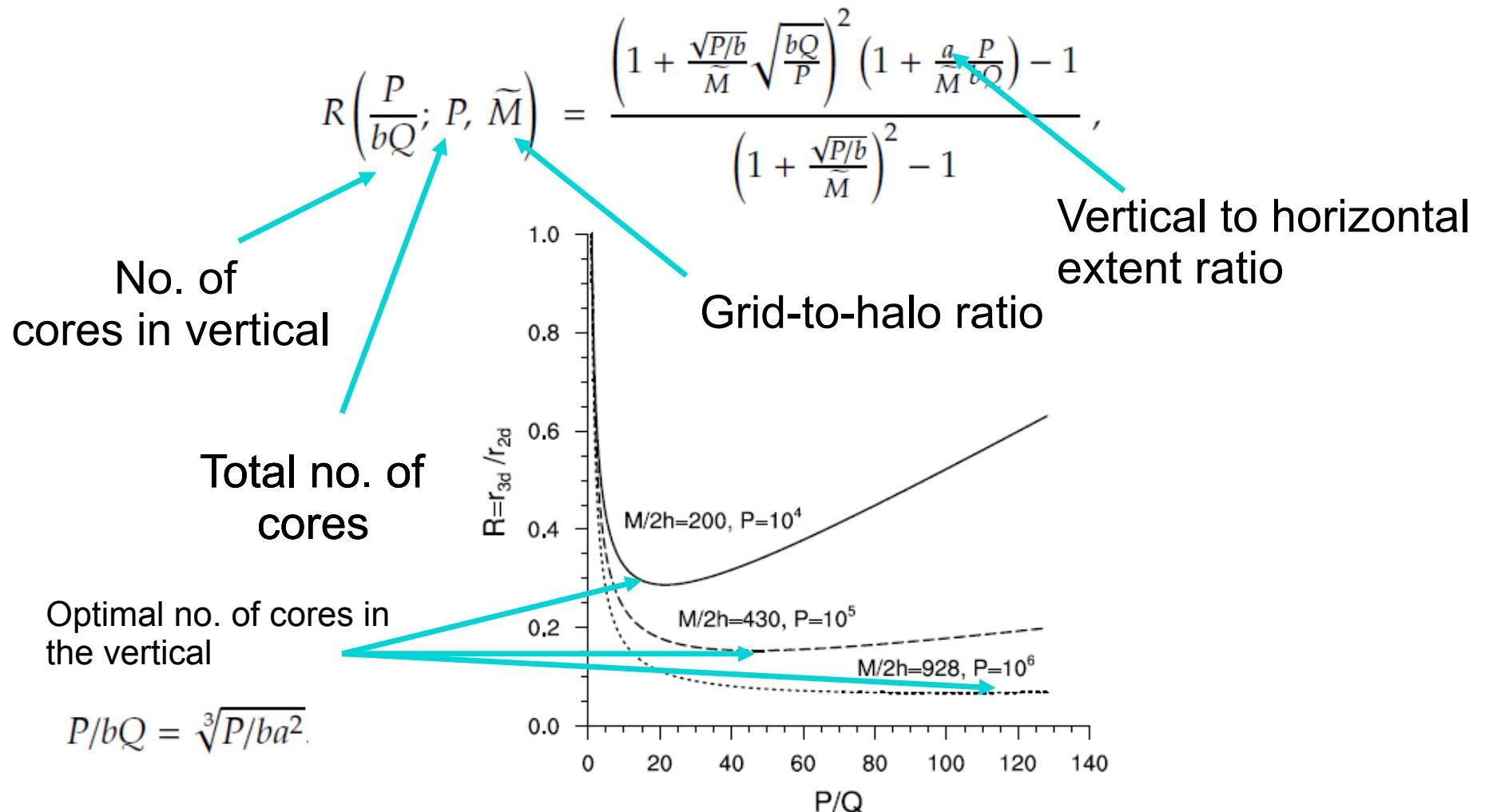


# Decaying turbulence scalability on CRAYs

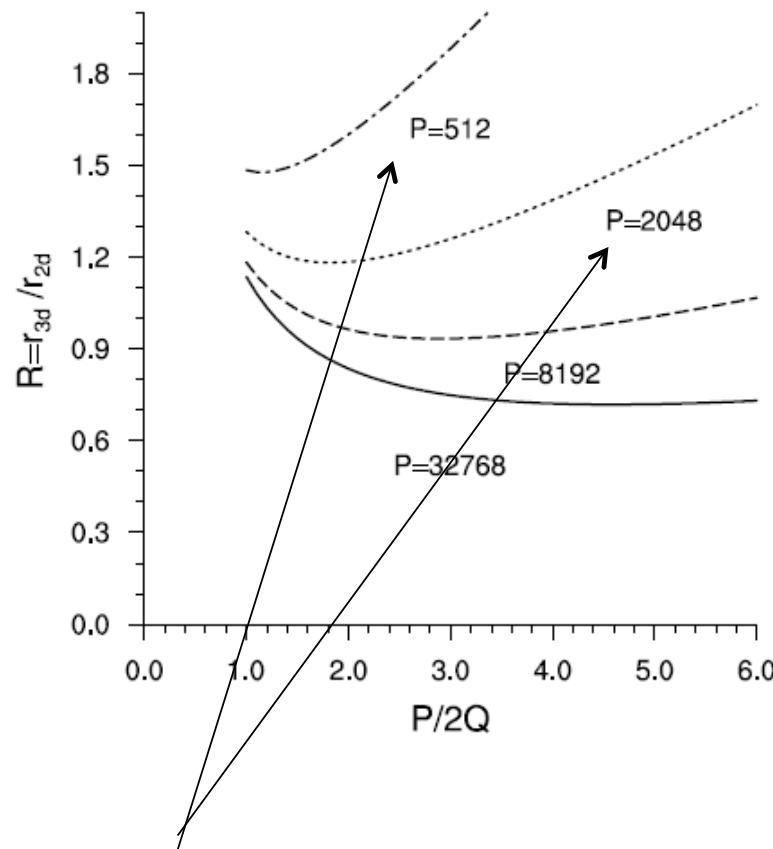


# Performance model for minimizing halo communication bandwidth

Examine  $R = r_{3d}/r_{2d}$ ,  $r_{3d} = [(np_{3d} + 2h) \times (mp_{3d} + 2h) \times (lp_{3d} + 2h) - V_{3d}]/V_{3d}$   
 where:  $r_{2d} = [(np_{2d} + 2h) \times (mp_{2d} + 2h) \times lp_{2d} - V_{2d}]/V_{2d}$ .



## Performance model for $1024 \times 512 \times 41$ grid of idealized climate simulation



Not always a performance gain from the 3D decomposition !

... but we can always use more cores to decrease time-to-solution !

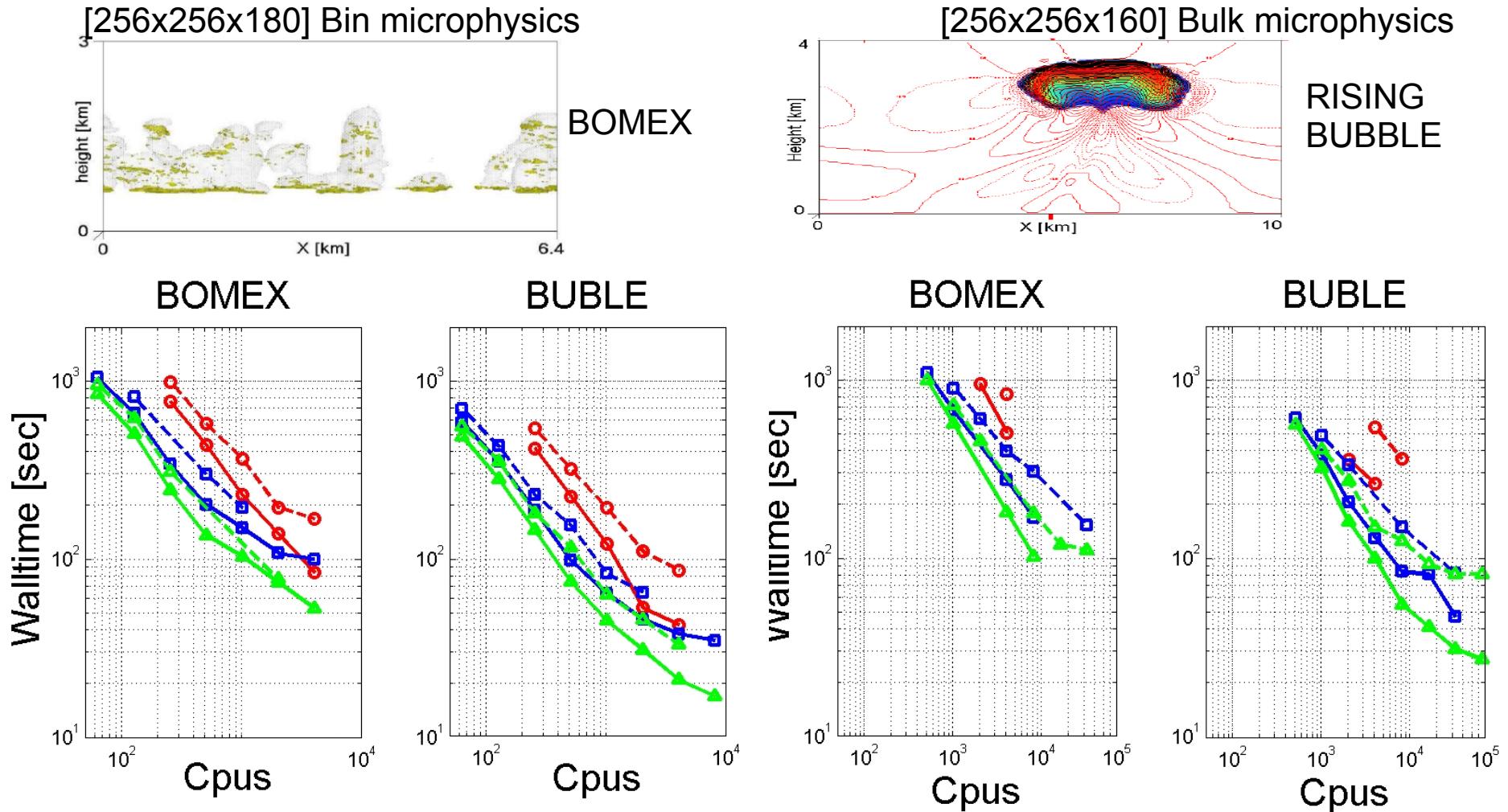
Table 1: Strong scaling of idealized climate simulation on a  $256 \times 128 \times 64$  grid, using 512 processors in the horizontal with increasing number of processors in the vertical.

Total processor number	512	1024	2048	4096
Processor configuration	$32 \times 16 \times 1$	$32 \times 16 \times 2$	$32 \times 16 \times 4$	$32 \times 16 \times 8$
Wallclock time [sec]	52	30	20	15

## Remarks on vertical algorithms

- Strong domain anisotropy (thin shell) results in very bad conditioning hurting the performance of iterative solvers
- Effective preconditioning is a key to the iterative solver convergence ...
- ... but it demands direct inversion of the tridiagonal matrix in the vertical direction (same for radiation)
- Thomas algorithm is a embarrassingly serial recurrence → special treatment necessary
- Possible solution is the recurrence doubling approach  
 $a(n+1) = Ba(n) + C$  is rewritten as:  
 $a(n+1) = F(B, C)a(1) + \text{parallel part}$
- + pipelining or single GATHER/SCATTER in the vertical (depending on the machine and number of cores)

# 2D/3D decomposition scalability (full model physics, Thomas preconditioner)



Strong scalability results with full model physics. The red, blue, and green lines shows results from IBM BG/L, CRAY XT4 and Cray XE6 respectively, the dashed lines represent 2D decomposition, the continuous lines 3D decomposition. Left and right panels show default and double resolution problems, respectively.

## Additional benefits of 3D MPI parallelization

- Most part of the EULAG code is now symmetrical in x,y,z
- A number of long lasting bugs revealed and fixed
- For large part of experiments, time-to-solution significantly decreased for fixed number of cores
- Size of the innermost loop is more flexible – beneficial for vectorization
- Many optimizations introduced in process of coding and testing of the new code

## More remarks ...

With the new, 3D parallelization we can attempt to simulate much larger problems, BUT there is a memory wall ahead.

→ Need for improving memory locality and cache use efficiency

Also, we can decompose problem to use many more cores, BUT there is a communication wall ahead

→ Need for minimizing halo updates and, especially, reduce number of global MPI operations to minimum

# Conclusions

- Three dimensional MPI parallel formulation, for symmetric (e.g. cubical turbulence) problems, can decrease time to solution for given number of cores used by factor of  $\sim 0.5$ .
- For thin-shell applications (weather and climate), it allows for decreasing time-to-solution by admitting much larger number of computing cores.