

Parallel methods for wave modelling codes

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Outline



Code development main issues:

- ❖ **Problem definition**
- ❖ **Hard- & Soft- Tools**
- ❖ **MATH representation**
- ❖ **GRID representation**
- ❖ **Examples**

**Wave modelling
for
exploration geophysics
&
engineering seismology**





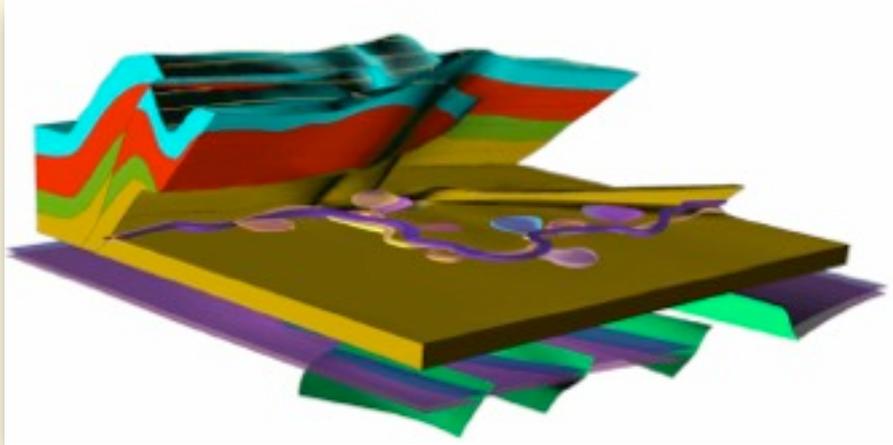
Modelling constraints



For realistic simulations:

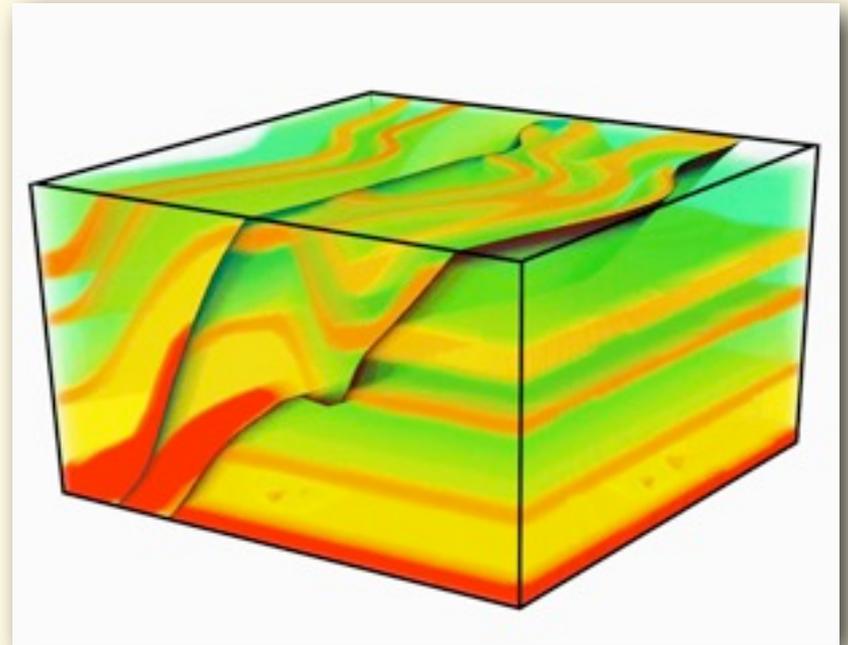
- ❖ *heterogeneous properties* must be correctly reproduced,
- ❖ *very complex structures* must be correctly modelled,
- ❖ *numerical algorithms* must be computationally efficient.

Space discretization:



*Geo-structure
complexity*

*Geo-structure
heterogeneity*



Computational issues:



The numerical solution requires

- ❖ *a huge computational effort,*
- ❖ **both in memory storage**
(from Giga to Tera nodes),
- ❖ **& CPU time**
(from hours to weeks) .

Computational issues:



- ❖ a *highly accurate method* is needed for reducing storage and CPU time requirements,
- ❖ an *efficient implementation* of the algorithm is needed for reducing the total cost of the simulation.

Computational constraints:



(consequences)

Algorithms must use:

- ❖ *vector/parallel platforms
(clusters, massive parallel...),*
- ❖ *efficient hard-/soft-ware
subroutines (FFT, Lapack, MPI...),*
- ❖ *low count of operations & of
primary storage (memory).*



High-order methods:

(possible choices)

- ❖ *finite difference methods,*
- ❖ *pseudo-spectral methods,*
- ❖ *finite element methods,*
- ❖ *spectral element methods,*
- ❖ *finite volume methods,*
- ❖ *discontinuous Galerkin methods.*

FD & Pseudo-spectral methods



3D elastic wave equation



Matrix velocity-stress formulation

$$\frac{\partial}{\partial t} \mathbf{W} = \mathbf{A} \frac{\partial}{\partial x} \mathbf{W} + \mathbf{B} \frac{\partial}{\partial y} \mathbf{W} + \mathbf{C} \frac{\partial}{\partial z} \mathbf{W} + \mathbf{f}$$

$$\mathbf{W} = \{v_x, v_y, v_z, \sigma_{xx}, \sigma_{yy}, \sigma_{zz}, \sigma_{xy}, \sigma_{xz}, \sigma_{yz}\}^T$$

$$\mathbf{f} = \{f_x/\rho, f_y/\rho, f_z/\rho, 0, 0, 0, 0, 0, 0\}^T$$

forcing source

particle velocity

stress field

Matrices of elastic constants



$$\mathbf{A} = \begin{pmatrix} 0 & 0 & 0 & 1/\rho & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho & 0 \\ \lambda + 2\mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ \lambda & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ \lambda & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & \mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & \mu & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}$$

λ & μ Lamé' elastic constants

Matrices of elastic constants



$$\mathbf{A} = \begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho & 0 & 0 \\ 0 & 0 & 0 & 0 & 1/\rho & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho \\ 0 & \lambda & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & \lambda + 2\mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & \lambda & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ \mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & \mu & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}$$

λ & μ Lamé' elastic constants

Matrices of elastic constants

λ & μ Lamé' elastic constants

A

B

C =

$$\begin{pmatrix} 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 1/\rho \\ 0 & 0 & 0 & 0 & 0 & 1/\rho & 0 & 0 & 0 \\ 0 & 0 & \lambda & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & \lambda & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & \lambda + 2\mu & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ \mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 & 0 \\ 0 & \mu & 0 & 0 & 0 & 0 & 0 & 0 & 0 \end{pmatrix}$$

FD & Pseudo-spectral solution



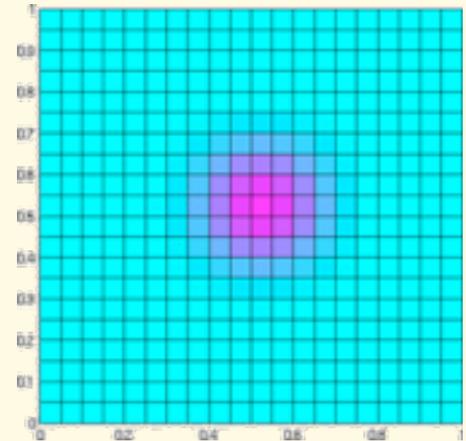
Matrix velocity-stress formulation

$$\frac{\partial}{\partial t} W = A \tilde{D}_x W + B \tilde{D}_y W + C \tilde{D}_z W + f$$

Discrete space derivative operators

Computed by using:

Cartesian grids



FD & Pseudo-spectral solution



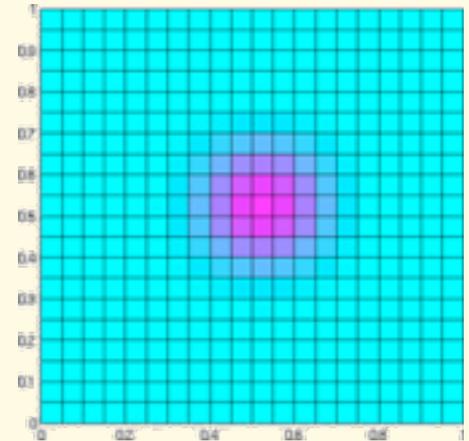
Matrix velocity-stress formulation

$$\frac{\partial}{\partial t} W = A \tilde{D}_x W + B \tilde{D}_y W + C \tilde{D}_z W + f$$

Discrete space derivative operators

Computed by using:

- ❖ Finite differences,
- ❖ Fourier Fast Transform,
- ❖ Chebyshev Fast Transform,
- ❖ Chebyshev Derivative Matrix.



Time integration is done by time stepping methods.

Space derivative operators



Can be obtained by differentiating an assumed expansion of the solution in given basis functions:

$$u(x) \approx u_N(x) = \sum_{j=0}^N \hat{u}_j \varphi_j(x)$$

spectral coefficients

Basis functions

- ❖ Taylor expansion (finite differences),
- ❖ Trigonometric functions (pseudo-spectral periodic),
- ❖ Chebyshev or Legendre polynomials (pseudo-spectral).

Space derivative operators



Expressing the approximant with the values $u_N(x_i)$ at the collocation points:

$$u_N(x) = \sum_{i=0}^N u_N(x_i) \phi_i(x)$$

node values

Lagrange or cardinal basis

$$\partial_x u_N(x) = \sum_{i=0}^N u_N(x_i) \partial_x \phi_i(x) = \sum_{i=0}^N u'_N(x_i) \phi_i(x)$$

$$u'_N(x_i) = \sum_{j=0}^N (\tilde{\mathbf{D}}_x)_{ij} u_N(x_j)$$



$$U'_N = \tilde{\mathbf{D}}_x U_N$$

Space derivative operators



Finite difference methods:

- ❖ banded matrix derivatives,
- ❖ efficient code implementation,
- ❖ low order & accuracy rely on order.

Pseudo-spectral methods:

- ❖ full matrix derivatives,
- ❖ efficient code implementation using FFT,
- ❖ high order & high accuracy.

Parallel computation Pseudo-spectral methods

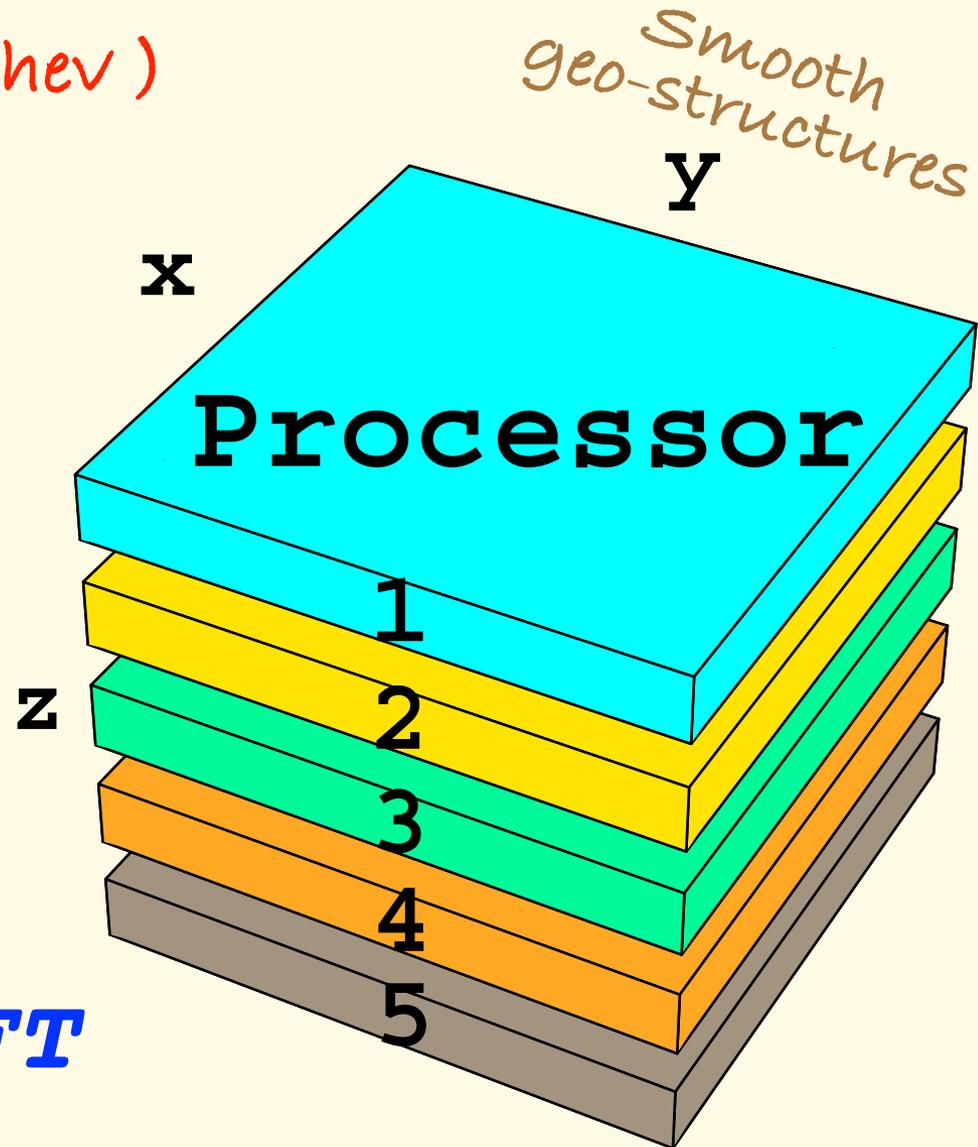


(Fourier & Chebyshev)

$$D_x \longleftrightarrow \partial/\partial x$$

$$D_y \longleftrightarrow \partial/\partial y$$

D_x & D_y by FFT



Parallel computation Pseudo-spectral methods



(Fourier & Chebyshev)

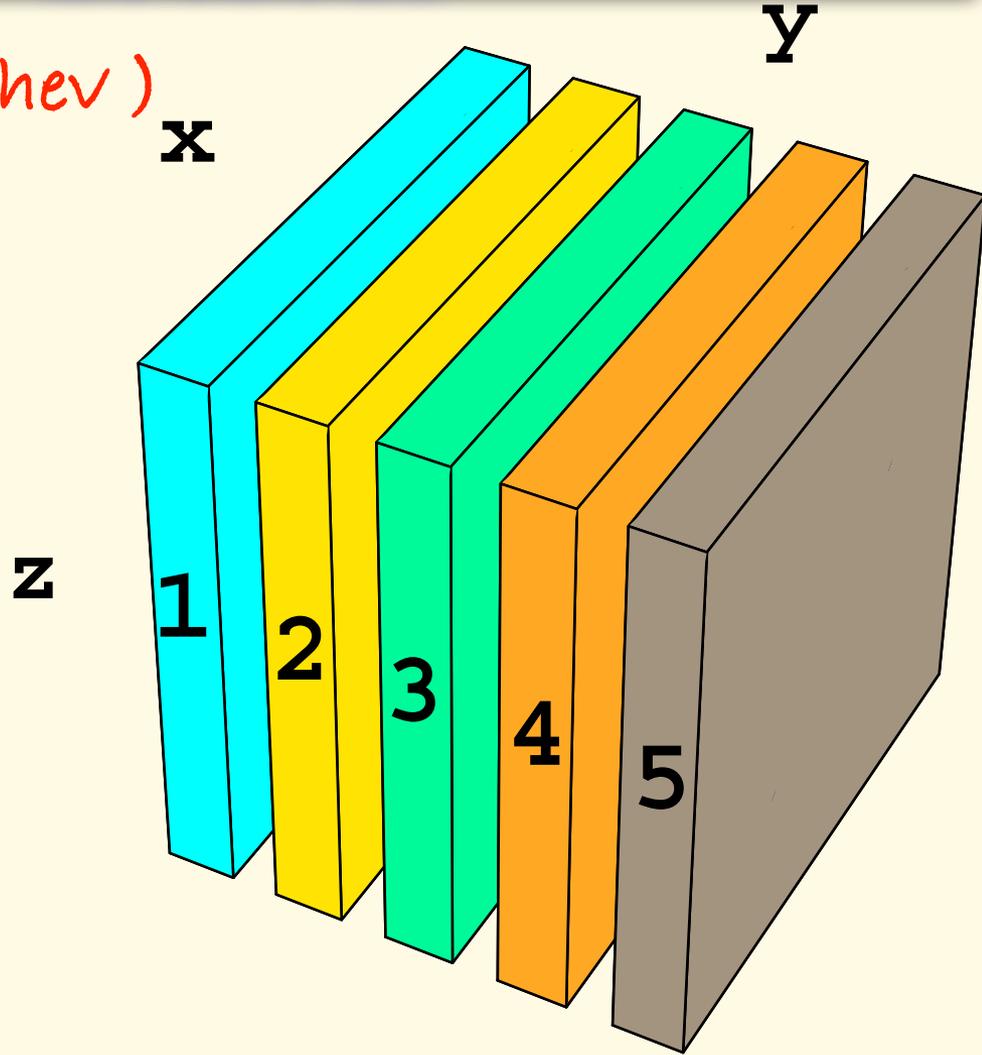
Transposition

+

$$\mathbf{D}_z \longleftrightarrow \partial/\partial z$$

\mathbf{D}_z by FFT

Global communications



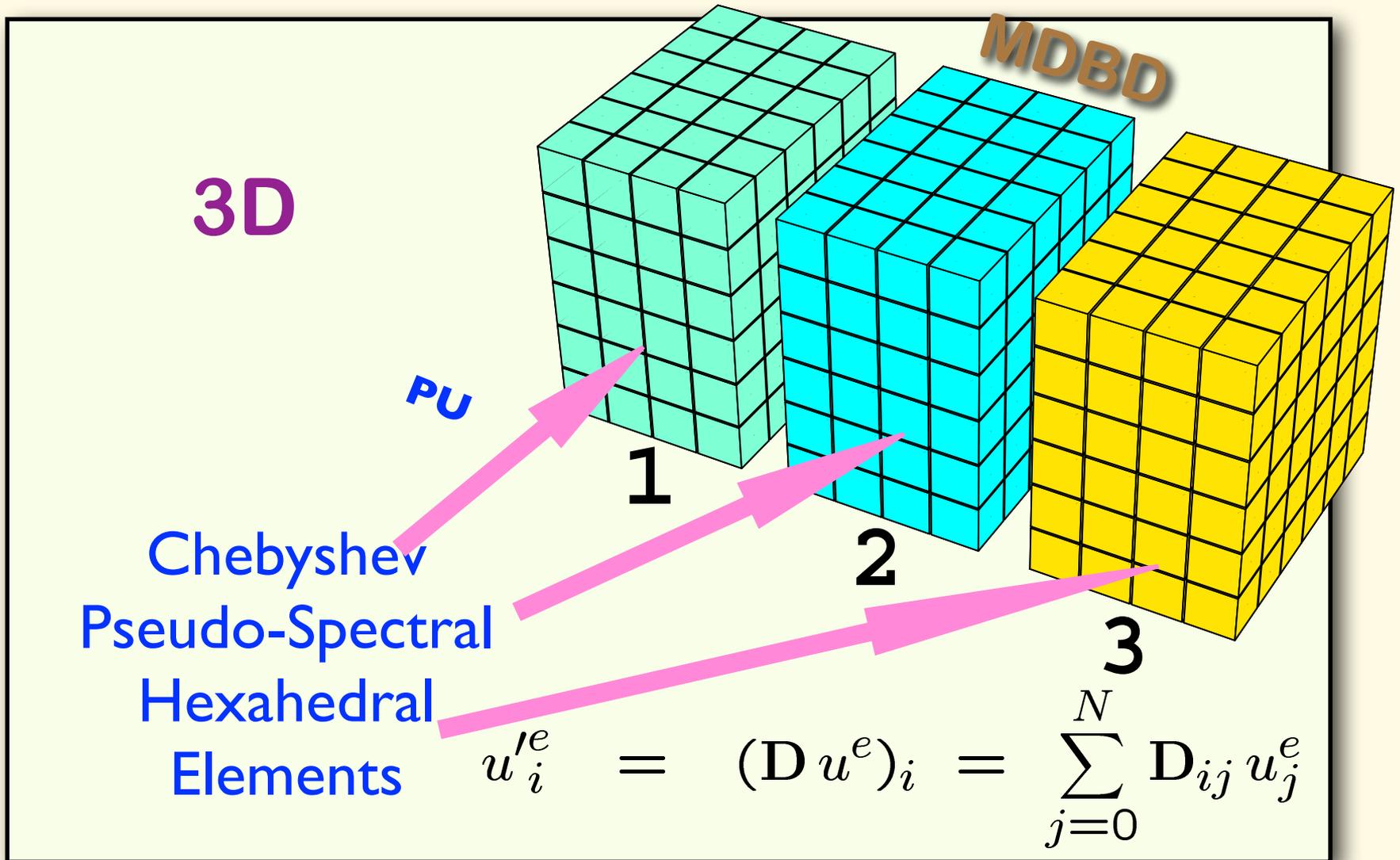
Parallel computation Multi-Domain Block Decomposition



MDBD pseudo-spectral method:

- ❖ Physical domain decomposed in a *hierarchical* way:
 - * First decomposition is in *large blocks*,
 - * Blocks decomposed in *small overlapping elements* ,
- ❖ *Derivatives* computed concurrently in each element by the Chebyshev pseudo-spectral method,
- ❖ *Continuity* across the element boundaries assured by the *overlap* of the discrete derivative operator,
- ❖ *Same accuracy* order at interfaces & in elements.

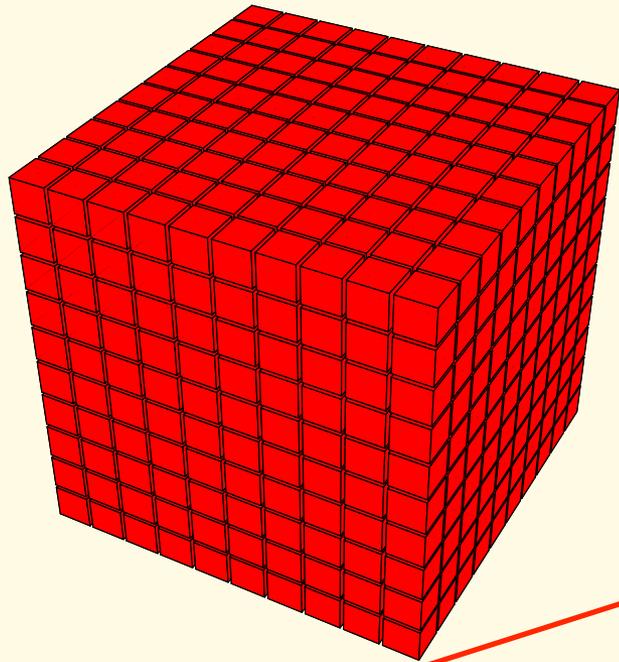
Multi-Domain Block Decomposition



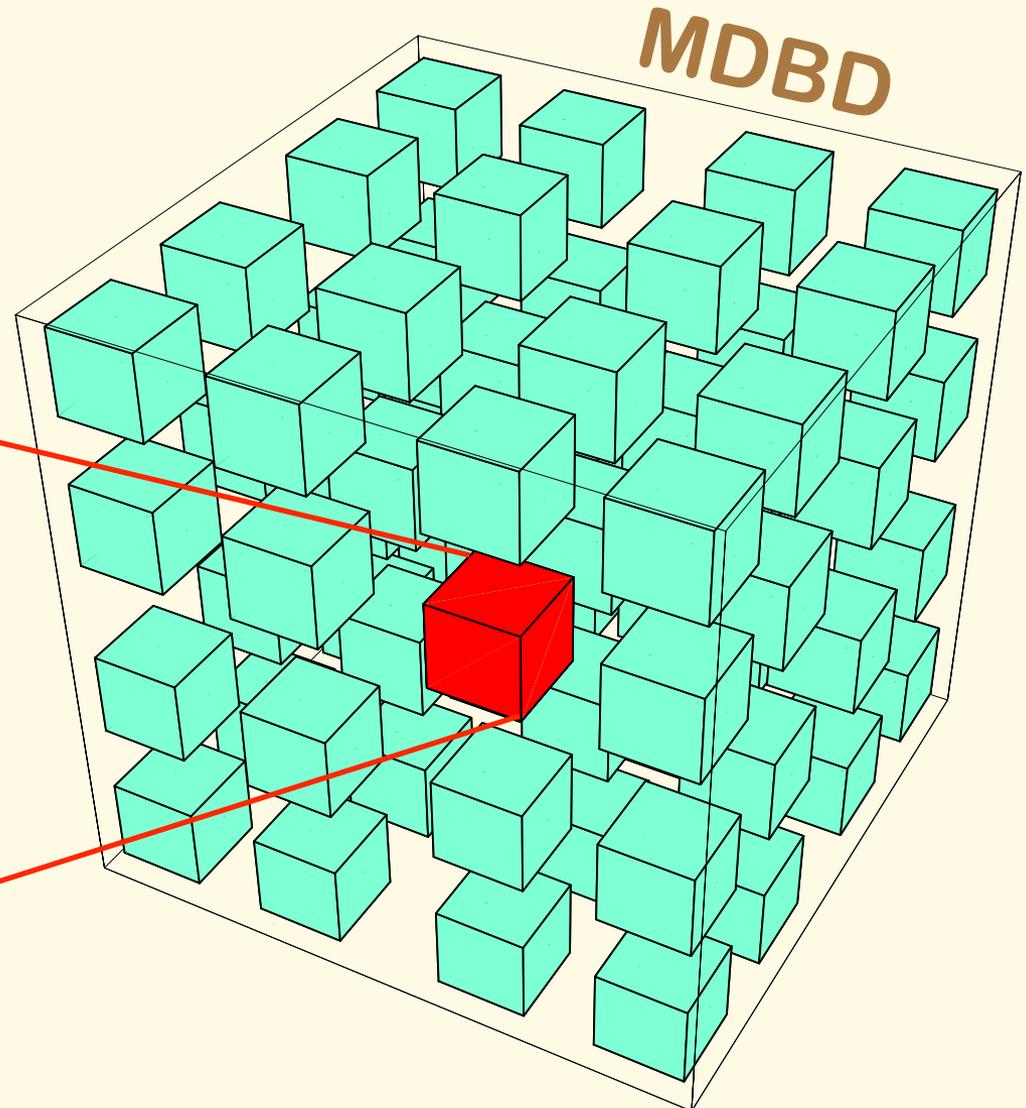
Multi-Domain Block Decomposition



Large scale



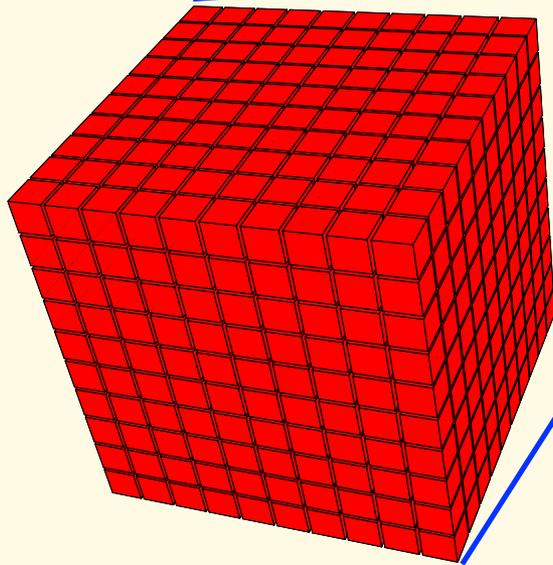
Chebyshev Pseudo-Spectral
Hexahedral Elements



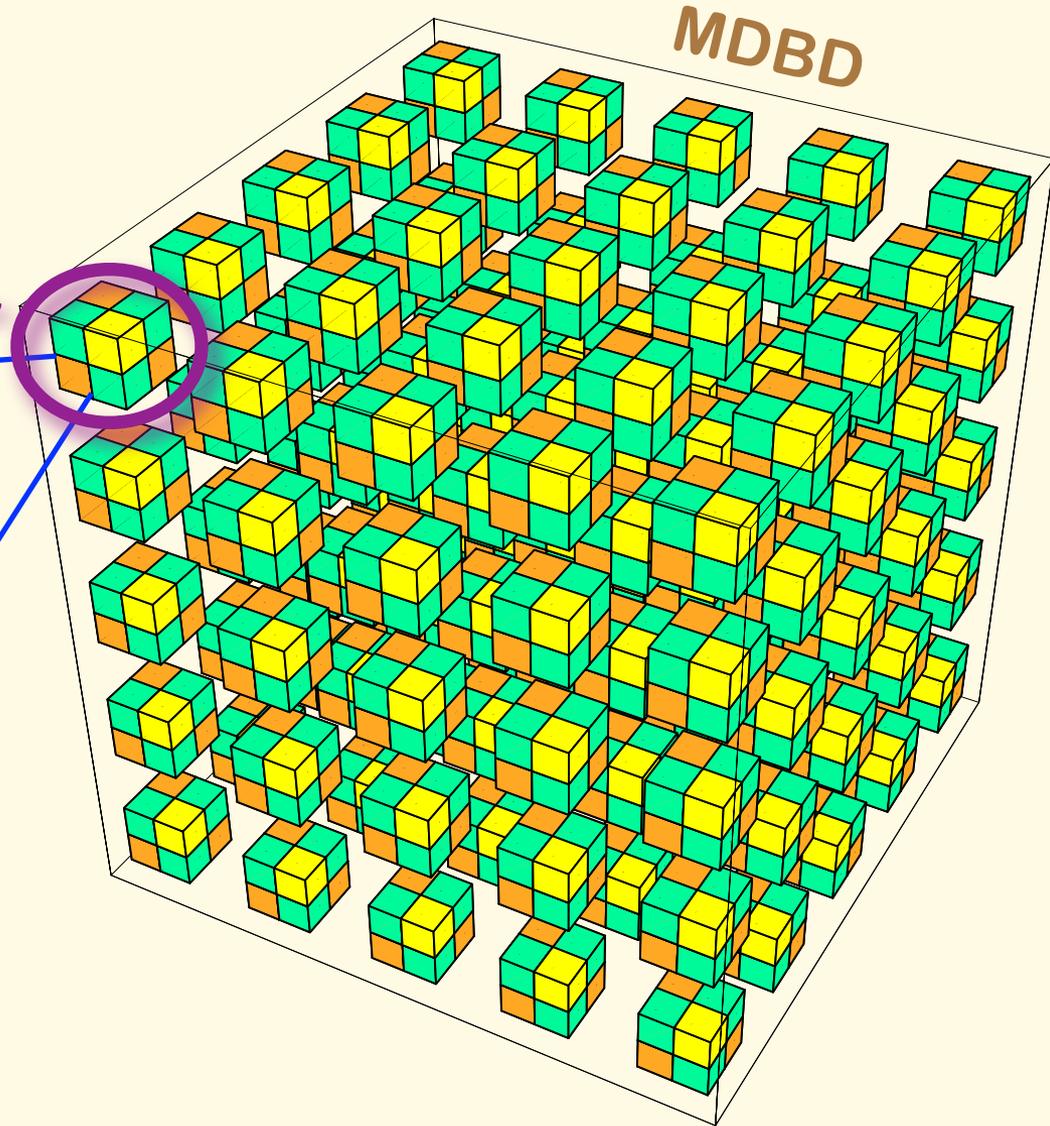
Multi-Domain Block Decomposition



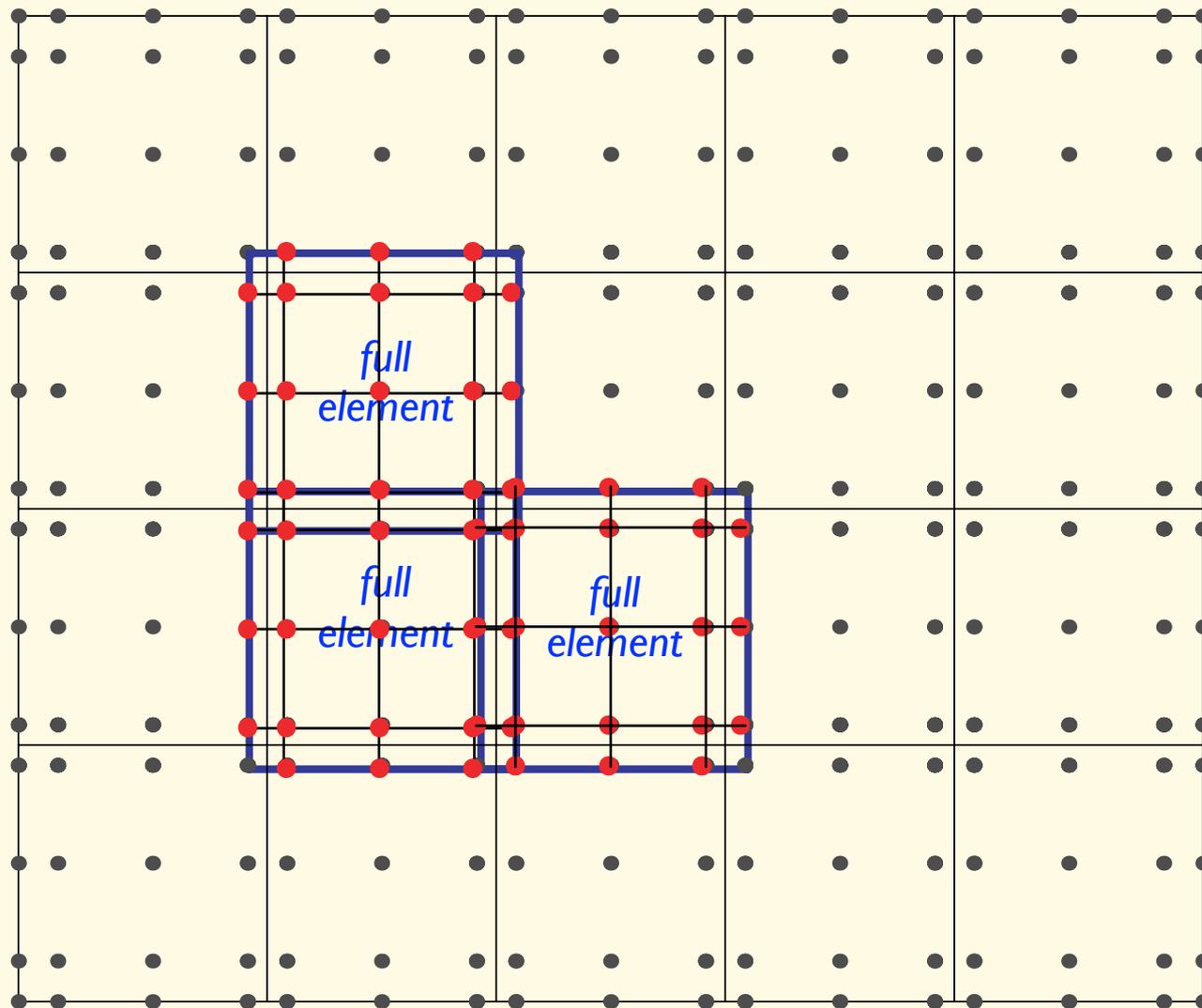
Computational node



Chebyshev Pseudo-Spectral
Hexahedral Elements



Chebyshev Derivative & Overlap



Kronecker Product & Vec Operator

Given $A = [a_{ij}]^{m \times n}$ & $B = [b_{ij}]^{p \times q}$

$$A \otimes B \doteq \begin{bmatrix} a_{11}B & a_{12}B & \dots & a_{1n}B \\ a_{21}B & a_{22}B & \dots & a_{2n}B \\ \vdots & \vdots & \ddots & \vdots \\ a_{m1}B & a_{m2}B & \dots & a_{mn}B \end{bmatrix} \quad \begin{array}{l} \text{block matrix} \\ \text{of order} \\ (mp \times nq) \end{array}$$

$\text{Vec}(\bullet)$ reshapes a generic rank- K tensor
in a column vector of length

$$n_1 n_2 \cdots n_K$$

Kronecker Product & Vec Operator

- Generalized inner product:

$$\mathbf{A} \star \mathbf{U} \doteq \sum_{l=0}^N A_{il} U_{lmn}$$

contraction
index

- Generalized transpose:

$$(U_{ijk})^T \doteq U_{jki}$$

rotation

by Kronecker product properties

$$(\mathbf{A}^e \otimes \mathbf{B}^e \otimes \mathbf{C}^e) \text{Vec}(\mathbf{U}^e) =$$

$$\text{Vec}(\mathbf{A}^e \star (\mathbf{B}^e \star (\mathbf{C}^e \star \mathbf{U}^e)^T)^T)^T$$

Derivative by Kronecker Product

$$\tilde{D}_x^e = \mathbf{I}_z^e \otimes \mathbf{I}_y^e \otimes \mathbf{D}_x^e$$

$$\tilde{D}_y^e = \mathbf{I}_z^e \otimes \mathbf{D}_y^e \otimes \mathbf{I}_x^e$$

$$\tilde{D}_z^e = \mathbf{D}_z^e \otimes \mathbf{I}_y^e \otimes \mathbf{I}_x^e$$

3D

Pseudo-spectral element
derivative operators

Unity matrix

by Kronecker product properties

$$\tilde{D}_x^e(U^e) = (\mathbf{I}_z^e \star (\mathbf{I}_y^e \star (\mathbf{D}_x^e \star U^e)^\top)^\top)^\top \quad X - axis$$

$$\tilde{D}_y^e(U^e) = (\mathbf{I}_z^e \star (\mathbf{D}_y^e \star (\mathbf{I}_x^e \star U^e)^\top)^\top)^\top \quad Y - axis$$

$$\tilde{D}_z^e(U^e) = (\mathbf{D}_z^e \star (\mathbf{I}_y^e \star (\mathbf{I}_x^e \star U^e)^\top)^\top)^\top \quad Z - axis$$

Derivative by Kronecker Product

Element wave field:

$$U_{ijk}^e = u^e(x_i, y_j, z_k, t) = \text{Vec}(U^e)_{k\bar{N}^2 + j\bar{N} + i + 1}$$

$\bar{N} = N + 1$

grid values *interpolation order* ***N***

Pseudo-spectral element derivatives:

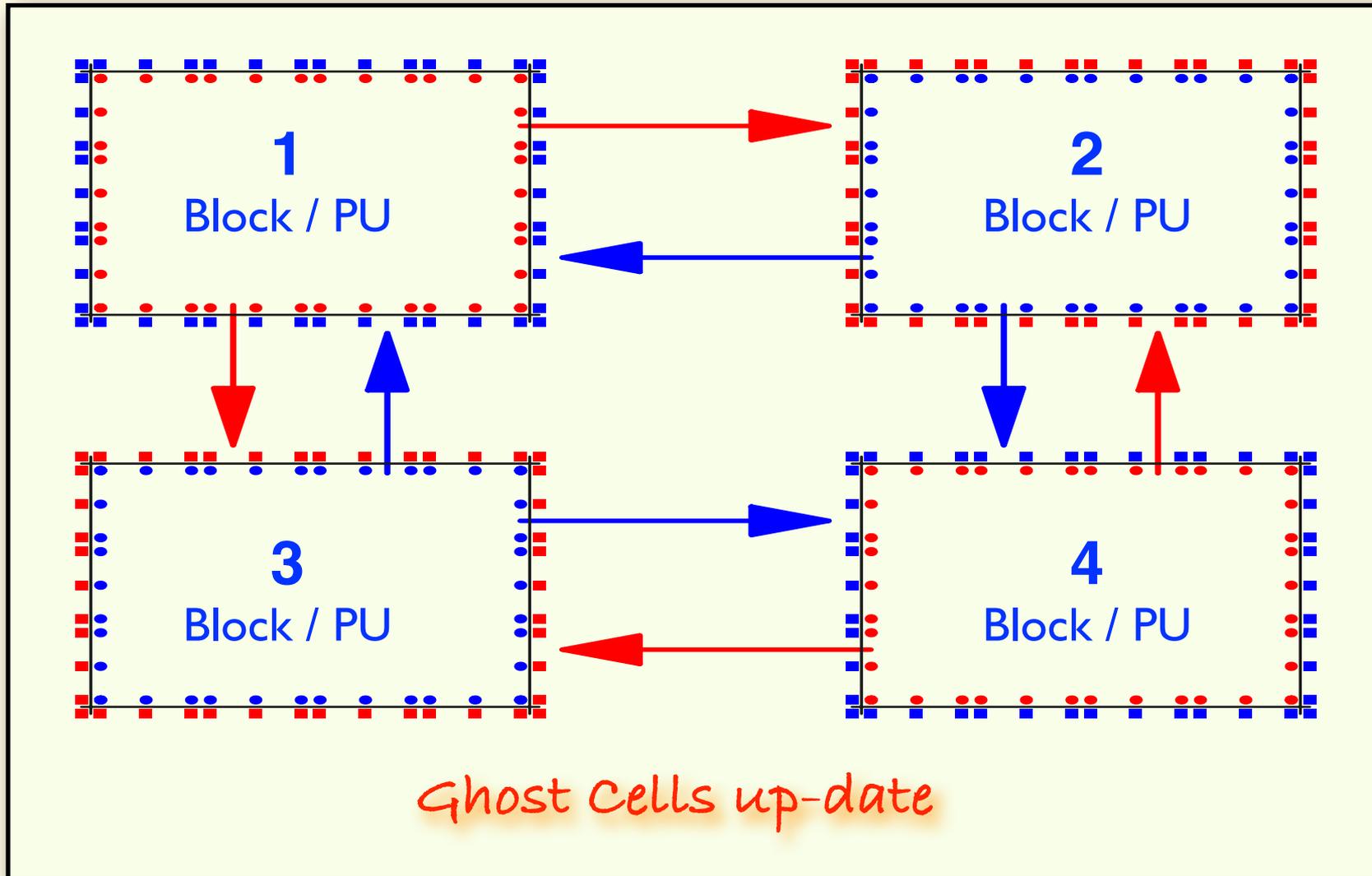
$$\tilde{D}_x^e(U^e) = D_x^e \star U^e \quad X - axis$$

$$\tilde{D}_y^e(U^e) = (D_y^e \star U^{e\top})^{\top\top} \quad Y - axis$$

$$\tilde{D}_z^e(U^e) = (D_z^e \star U^{e\top\top})^{\top} \quad Z - axis$$

Computed by optimized *matrix-matrix* products (LAPACK)

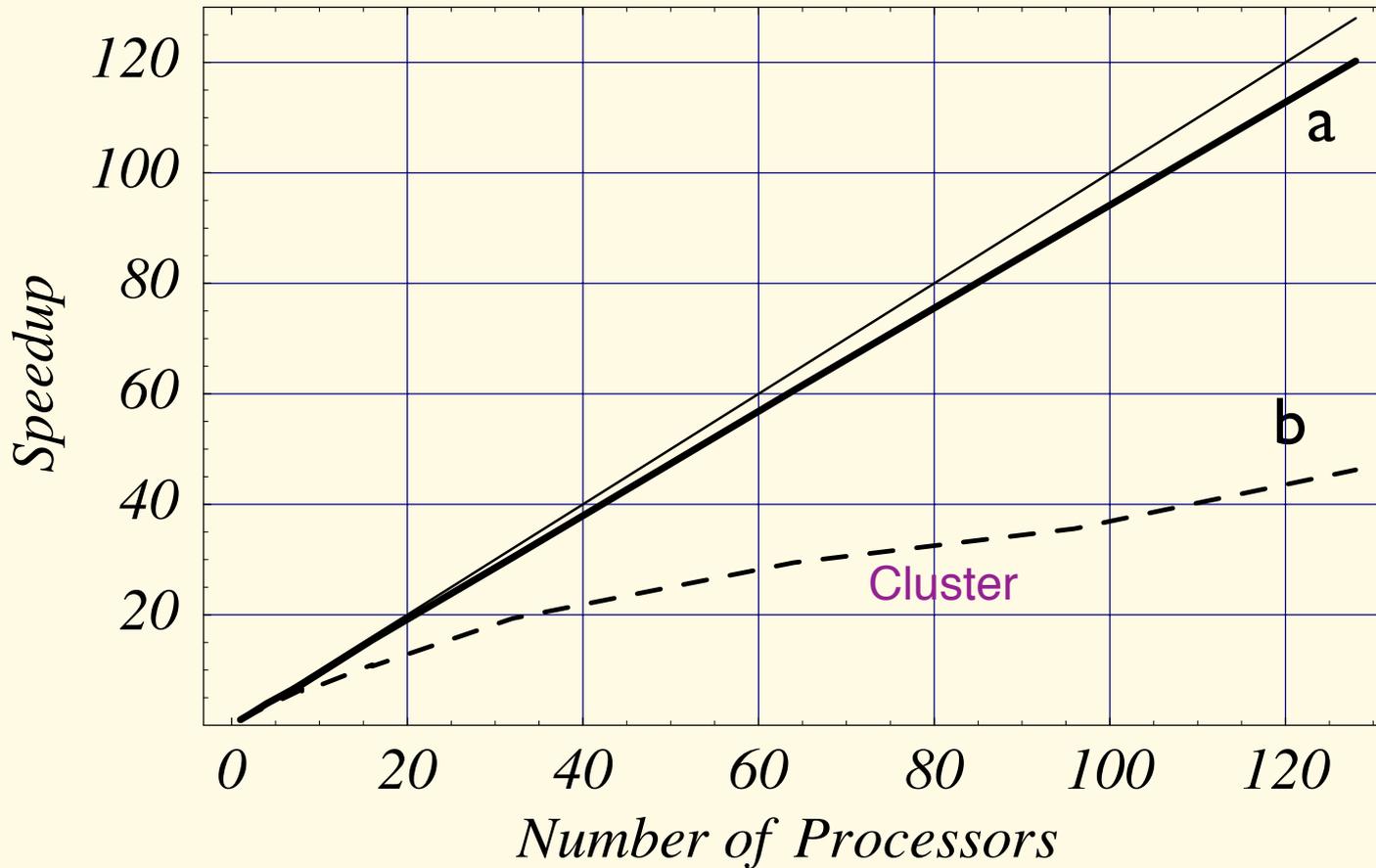
Synchronization & communications





MDBD Scaled // Speed-up

	32800 elements	9 nodes/element	419400 elements
a:	230 Mw (226x226x226)		45.1 Gw (1796x898x898)
b:	400 Mw (242x242x242)		51.5 Gw (1922x962x962)
	1730 elements	22 nodes/element	221200 elements



IBM
SP5
512

MDBD Scaled // Speed-up



32800 elements

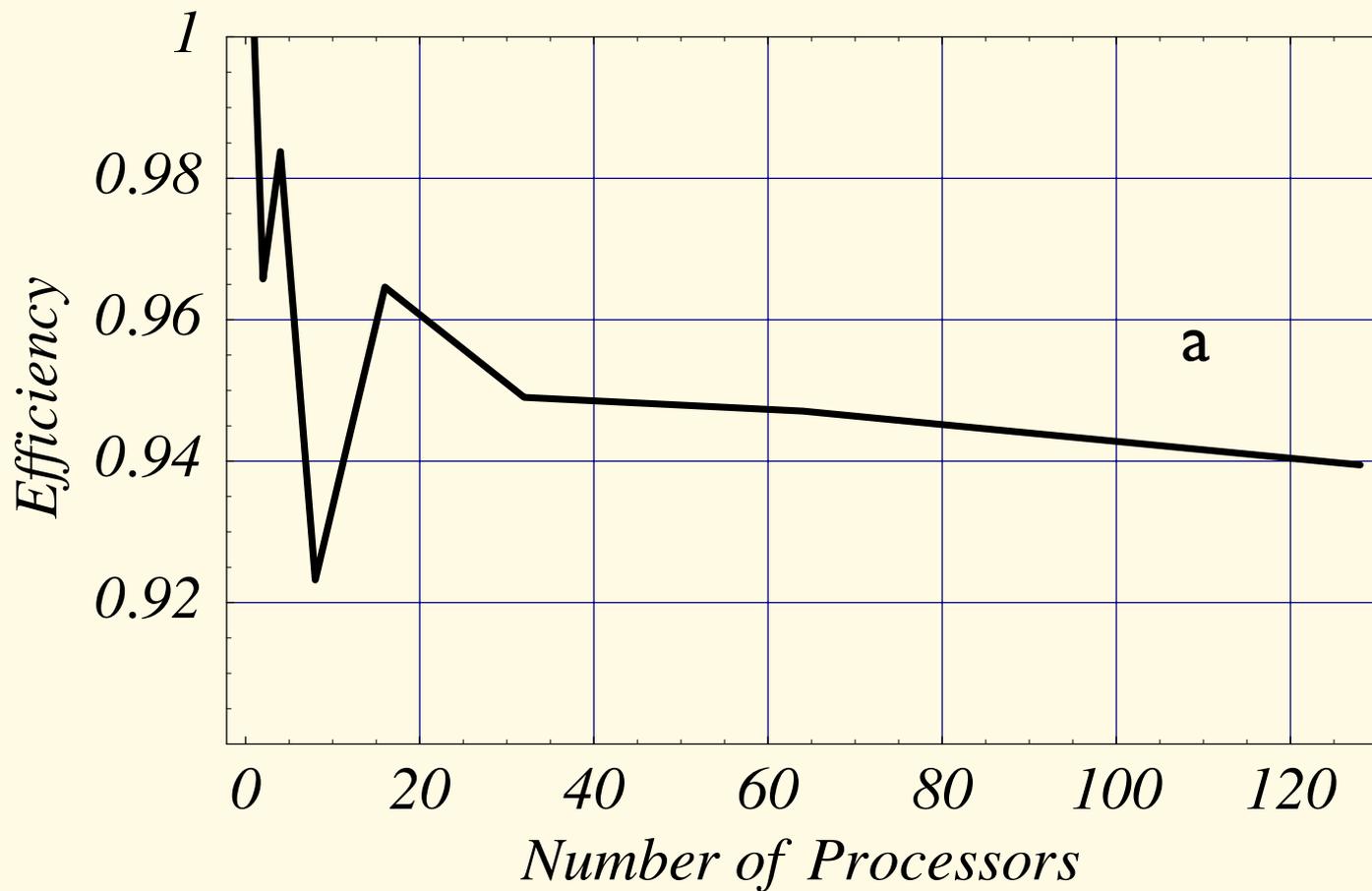
9 nodes/element

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a: 230 Mw (226x226x226)

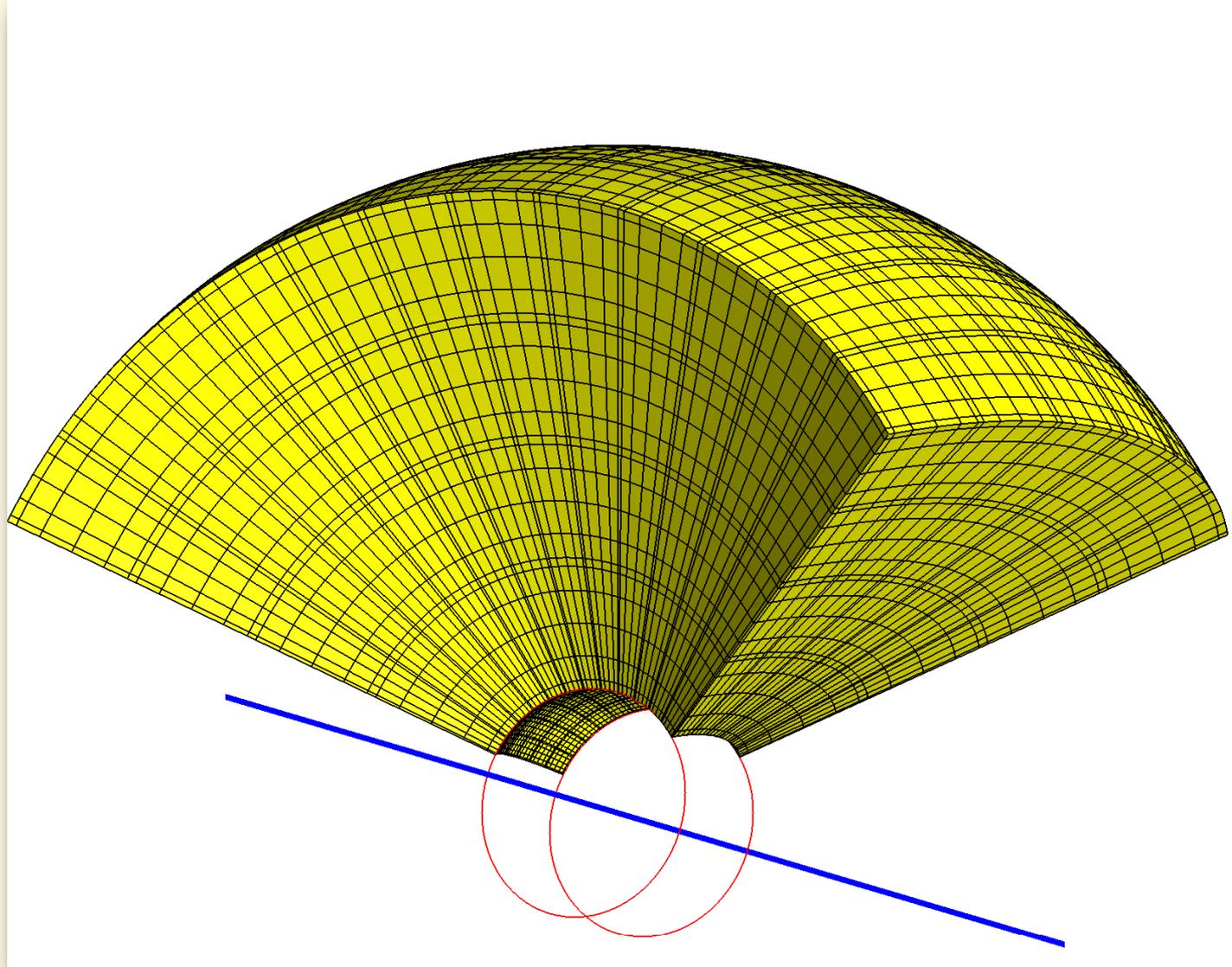


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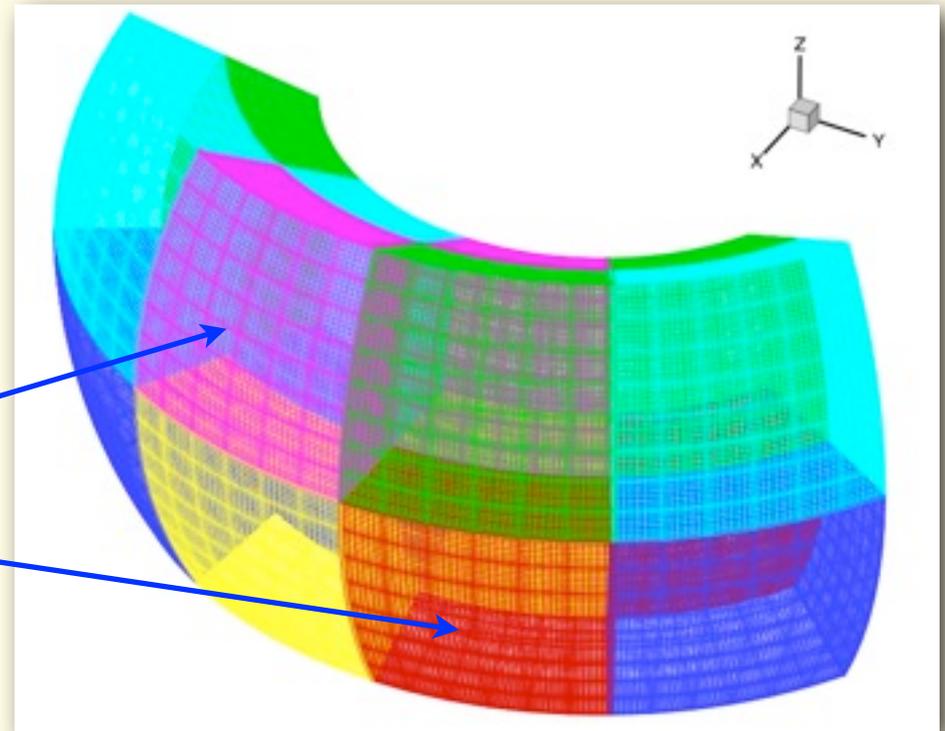
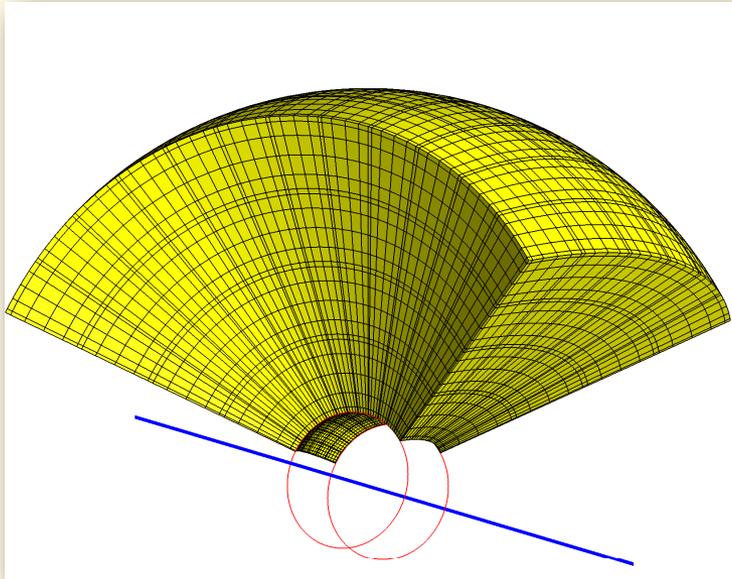


IBM
SP5
512

Spherical Coordinates



Spherical Coordinates

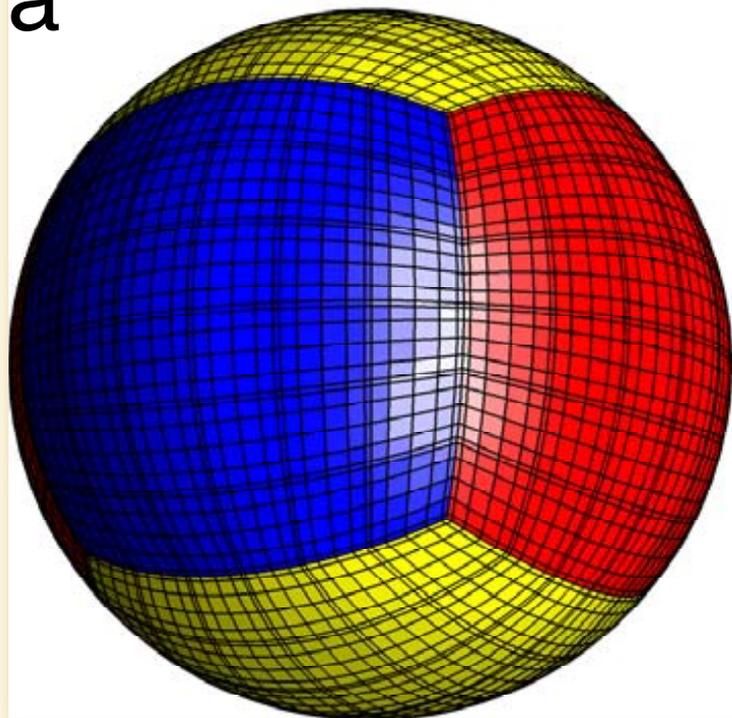


Parallel decomposition

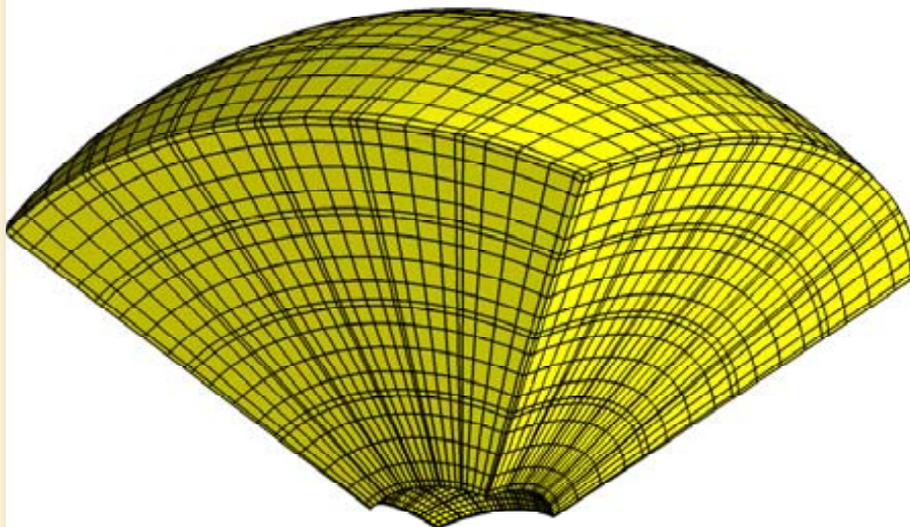
Cubed Sphere

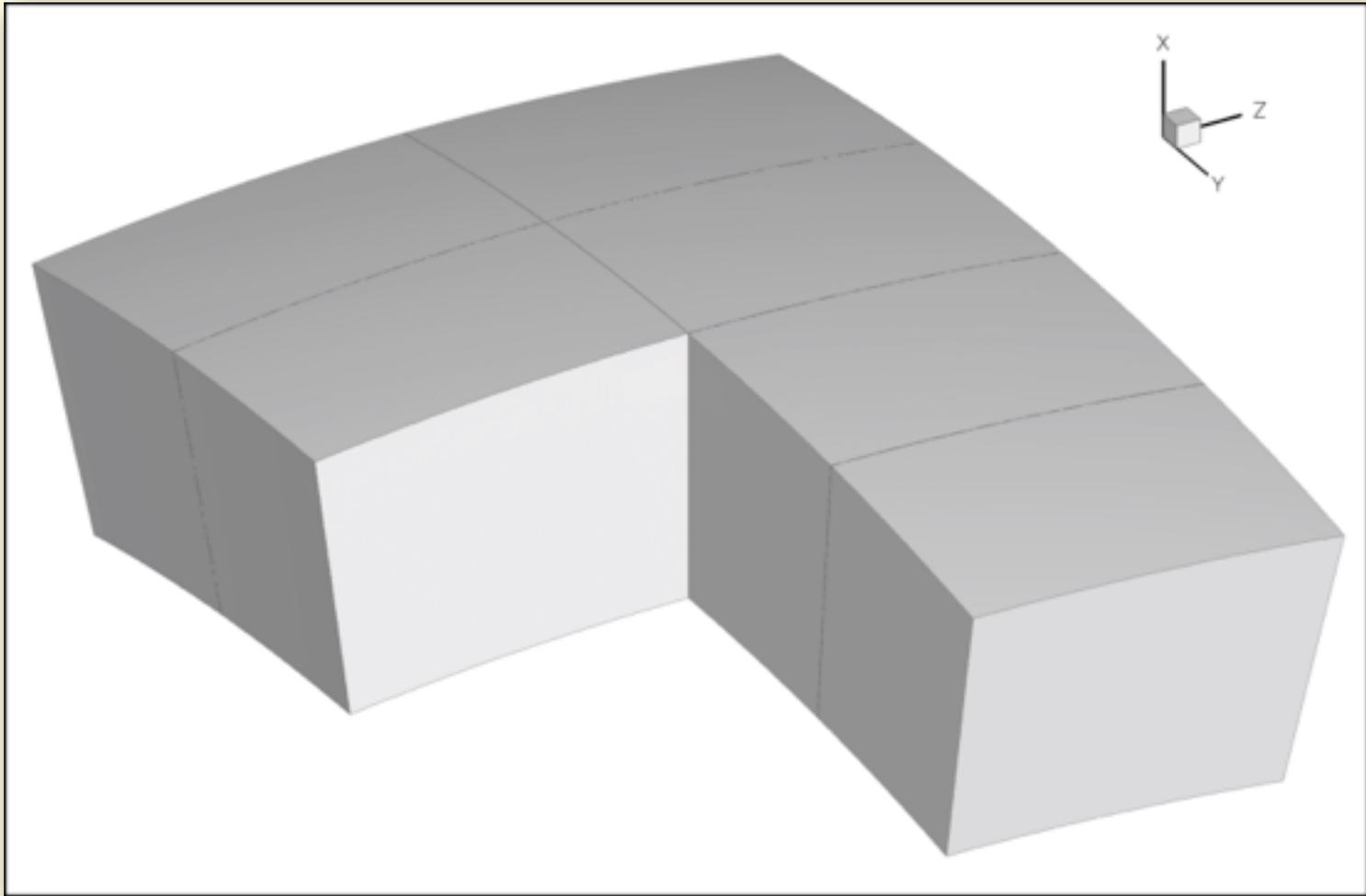


a



b





**Finite element methods
(FEM)**

&

**Spectral element methods
(SEM)**



3D elastic wave equation



$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \nabla [(\lambda + 2\mu) \nabla \cdot \mathbf{u}] - \nabla \cdot (\mu \nabla \mathbf{u}) = \mathbf{f}$$

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

matrix formulation

$$\boldsymbol{\sigma}(\mathbf{u}) = \mathbf{C} \boldsymbol{\epsilon}(\mathbf{u}) \quad \text{stress-strain relation}$$

$$\boldsymbol{\epsilon}(\mathbf{u}) = \mathcal{D} \mathbf{u} \quad \text{strain-displacement relation}$$

2D elastic wave equation



$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

in 2D:

$$\mathcal{D} = \begin{bmatrix} \partial_x & 0 \\ 0 & \partial_y \\ \partial_y & \partial_x \end{bmatrix}$$

differential operator

$$\mathbf{C} = \begin{bmatrix} \lambda + 2\mu & \lambda & 0 \\ \lambda & \lambda + 2\mu & 0 \\ 0 & 0 & \mu \end{bmatrix}$$

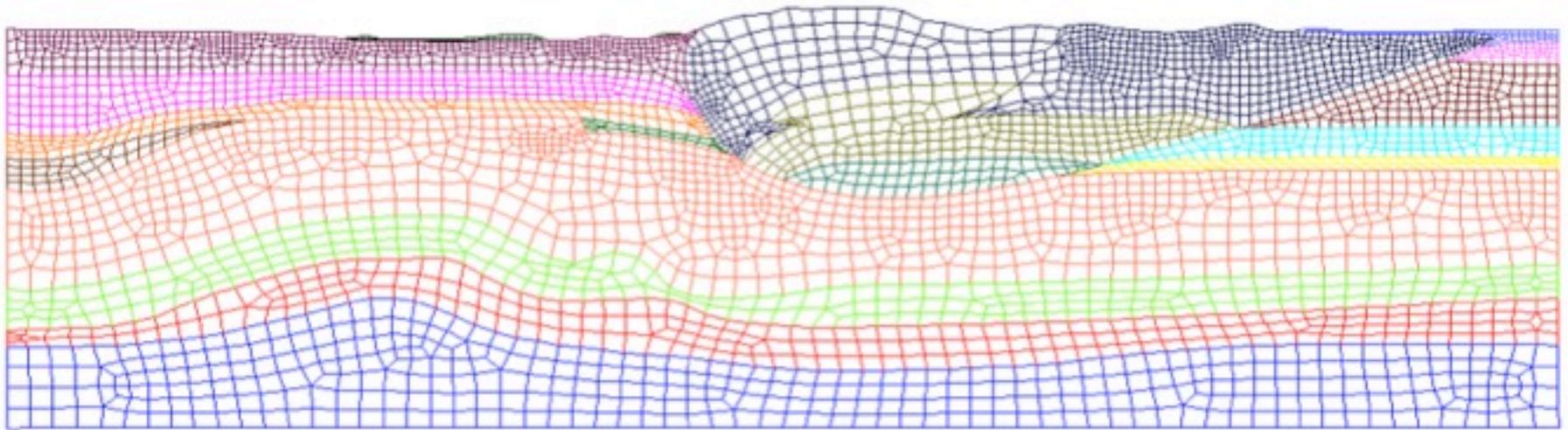
elastic stiffness matrix

$$\boldsymbol{\sigma} = \boldsymbol{\sigma}(\mathbf{x}, t) = \{\sigma_{xx}, \sigma_{yy}, \sigma_{xy}\}^\top$$

$$\boldsymbol{\epsilon} = \boldsymbol{\epsilon}(\mathbf{x}, t) = \{\epsilon_{xx}, \epsilon_{yy}, \epsilon_{xy}\}^\top$$

stress & strain vectors

Fem/Sem mesh



$$\mathbf{u} \cong \tilde{\mathbf{u}}(x, y, z, t) = \bigcup_{e=1}^{n_e} \tilde{\mathbf{u}}^e(x, y, z, t)$$

$$\tilde{\mathbf{u}}^e(x, y, z, t) = \sum_{i,j,k=0}^N \mathbf{u}_{ijk}^e(t) \Phi_{ijk}(x, y, z)$$

shape functions

node values



Fem/Sem solution

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

strong form

$$\frac{d^2}{dt^2} \int_{\Omega} \rho \mathbf{w}^\top \mathbf{u} \, d\Omega + \int_{\Omega} \mathbf{w}^\top \mathcal{D}^\top \mathbf{C} \mathcal{D} \mathbf{u} \, d\Omega = \int_{\Omega} \mathbf{w}^\top \mathbf{f} \, d\Omega$$

Fem/Sem solution

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

weak form



$$\frac{d^2}{dt^2} \int_{\Omega} \rho \mathbf{w}^\top \mathbf{u} \, d\Omega + \int_{\Omega} \mathbf{w}^\top \mathcal{D}^\top \mathbf{C} \mathcal{D} \mathbf{u} \, d\Omega = \int_{\Omega} \mathbf{w}^\top \mathbf{f} \, d\Omega$$

Fem/Sem solution

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

$$\frac{d^2}{dt^2} \int_{\Omega} \rho \mathbf{w}^\top \mathbf{u} \, d\Omega + \int_{\Omega} \mathbf{w}^\top \mathcal{D}^\top \mathbf{C} \mathcal{D} \mathbf{u} \, d\Omega = \int_{\Omega} \mathbf{w}^\top \mathbf{f} \, d\Omega$$

$$\tilde{\mathbf{u}}^e(x, y, z, t) = \sum_{i,j,k=0}^N \mathbf{u}_{ijk}^e(t) \Phi_{ijk}(x, y, z)$$

$$\mathbf{M} \ddot{\mathbf{U}} + \mathbf{K} \mathbf{U} = \mathbf{F}$$

Solve a system of second order ordinary differential equations

Fem/Sem solution

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

$$\frac{d^2}{dt^2} \int_{\Omega} \rho \mathbf{w}^\top \mathbf{u} \, d\Omega + \int_{\Omega} \mathbf{w}^\top \mathcal{D}^\top \mathbf{C} \mathcal{D} \mathbf{u} \, d\Omega = \int_{\Omega} \mathbf{w}^\top \mathbf{f} \, d\Omega$$

$$\mathbf{M} = \sum_{e=1}^{n_e} \mathbf{M}^{(e)}$$

mass

$$\mathbf{K} = \sum_{e=1}^{n_e} \mathbf{K}^{(e)}$$

stiffness

$$\mathbf{F} = \sum_{e=1}^{n_e} \mathbf{F}^{(e)}$$

load

$$\mathbf{M} \ddot{\mathbf{U}} + \mathbf{K} \mathbf{U} = \mathbf{F}$$

Solve a system of second order ordinary differential equations

Fem/Sem solution

$$\rho \frac{\partial^2 \mathbf{u}}{\partial t^2} - \mathcal{D}^\top \boldsymbol{\sigma} = \mathbf{f}$$

$$\frac{d^2}{dt^2} \int_{\Omega} \rho \mathbf{w}^\top \mathbf{u} \, d\Omega + \int_{\Omega} \mathbf{w}^\top \mathcal{D}^\top \mathbf{C} \mathcal{D} \mathbf{u} \, d\Omega = \int_{\Omega} \mathbf{w}^\top \mathbf{f} \, d\Omega$$

$$\mathbf{M} \ddot{\mathbf{U}} + \mathbf{K} \mathbf{U} = \mathbf{F}$$

initial conditions



$$\mathbf{U}(0) = \mathbf{U}_0$$

$$\dot{\mathbf{U}}(0) = \dot{\mathbf{U}}_0$$

Solve a system of second order ordinary differential equations

Finite & spectral elements



Finite elements:

- ❖ low order & low accuracy (in general),
- ❖ shape functions by **linear, quadratic and cubic polynomials**,
- ❖ triangular/quadrangular or tetrahedral/hexahedral elements.

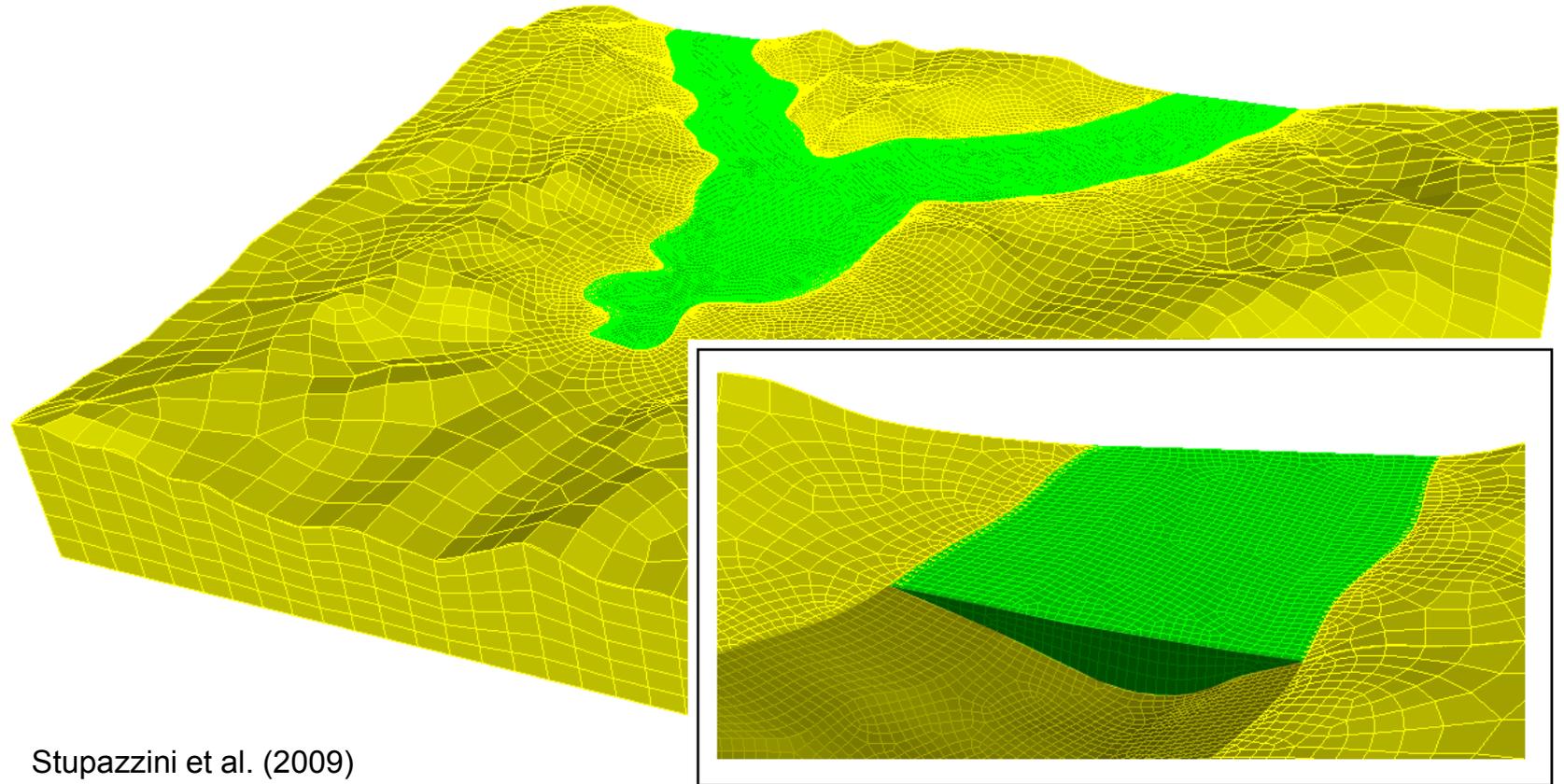
Spectral elements:

- ❖ high order & high accuracy,
- ❖ shape functions by **Chebyshev and Legendre orthogonal polynomials**,
- ❖ quadrangular or hexahedral elements.

SEM in 3D: Mesh design



Realistic example: **The Grenoble valley**



Stupazzini et al. (2009)

Spectral elements



Chebyshev polynomials:

- ❖ **non-diagonal** system matrices,
- ❖ **implicit** schemes (*in time*) \Rightarrow linear systems solution (*fast solvers, sub-structuring/EBE-iterative*),
- ❖ **unconditionally** stable \Rightarrow large time steps.

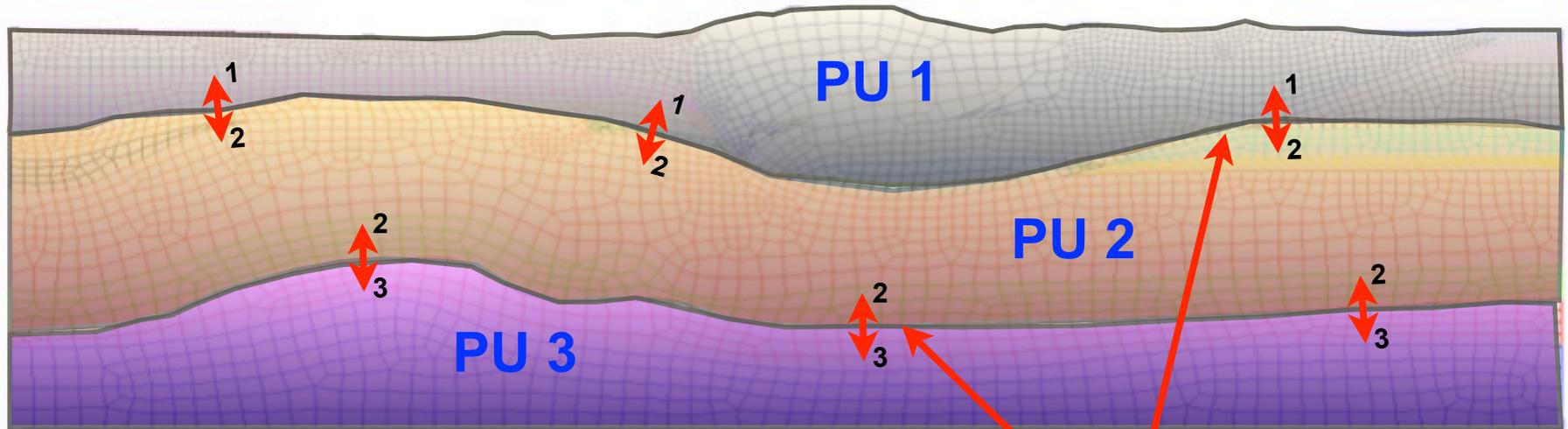
Legendre polynomials:

- ❖ **diagonal** system matrices,
- ❖ **explicit** schemes (*in time*) \Rightarrow faster (*in principle*),
- ❖ **conditionally** stable \Rightarrow time steps must honour CFL limit.

Parallel computation SEM methods



Domain partition



Processor task allocation

Interface data exchange

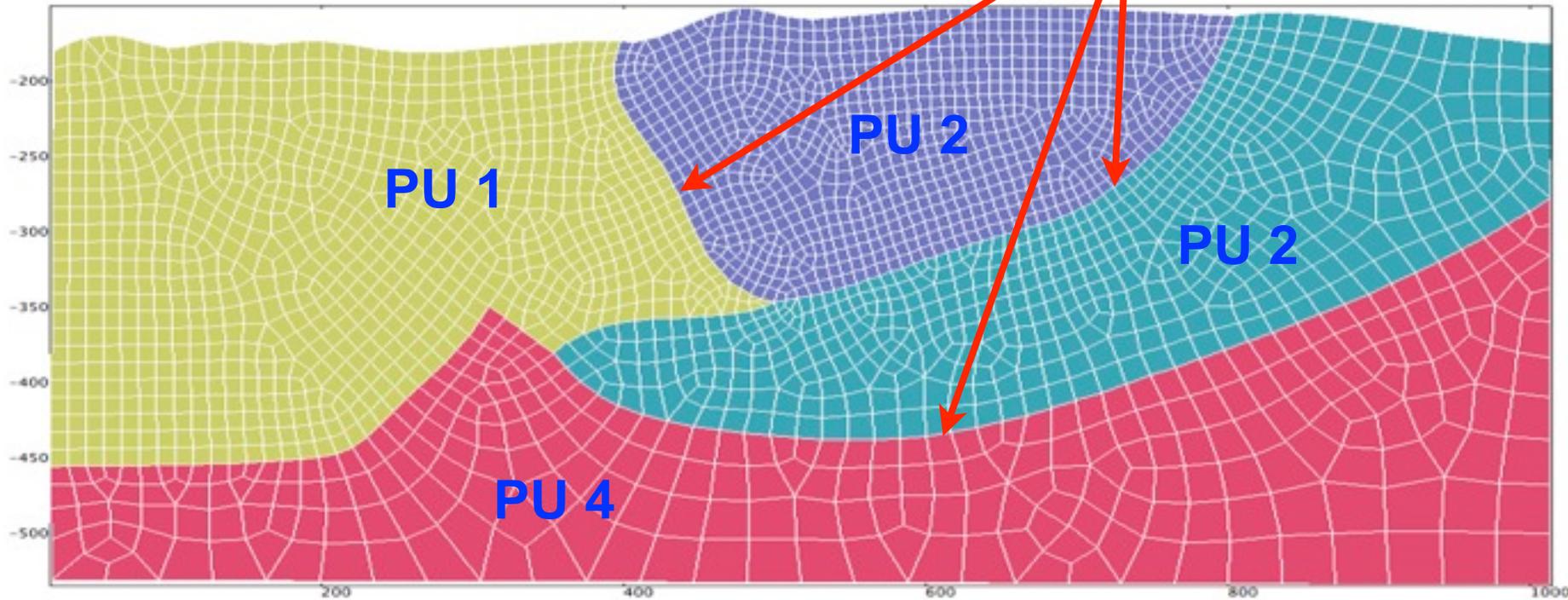


SEM partitioning



Processor task allocation

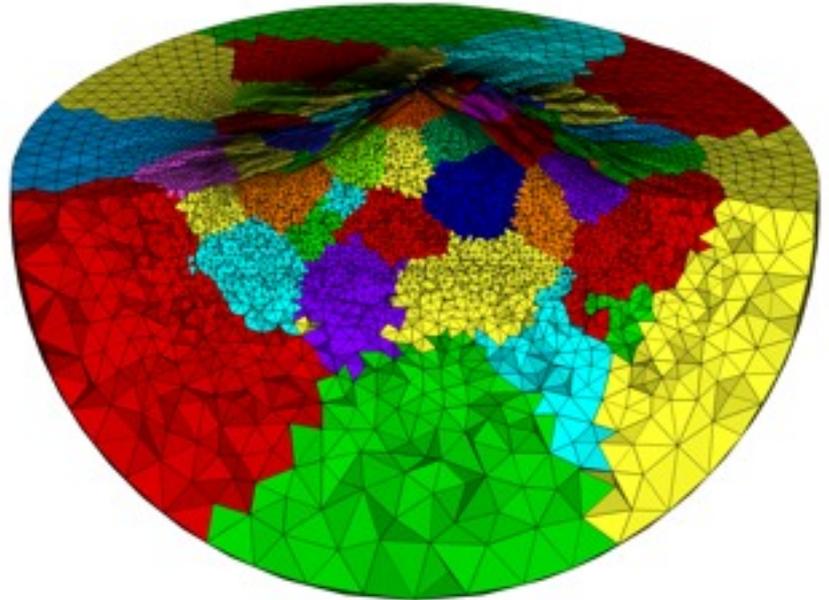
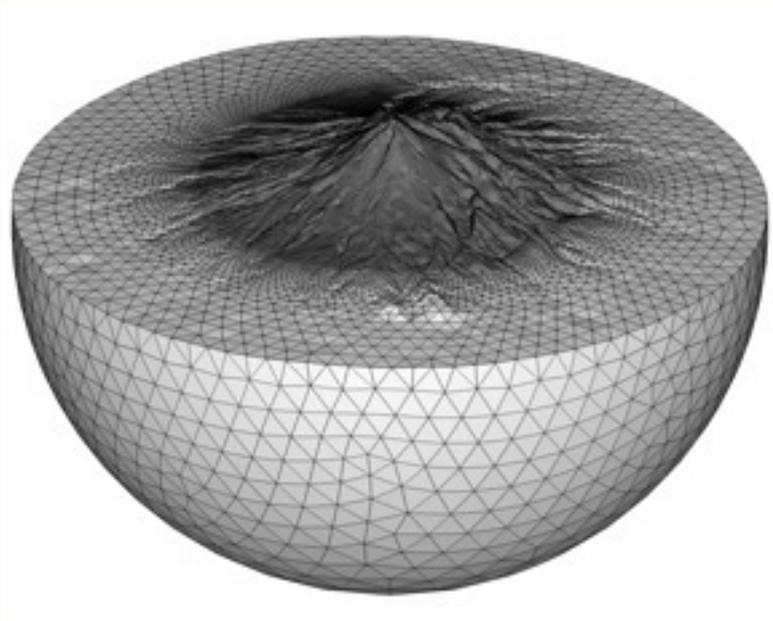
Interface data exchange



Discontinuous Galerkin (DG) Approach

Modeling of Scattered Waves in Merapi Volcano

(J. Wassermann)



- problem adapted mesh generation
- load balancing by partitioning & grouping subdomains (see Metis or Jostle software)

Parallel implementation



Very efficient parallel codes can be developed because in solving:

$$M \ddot{U} + K U = F$$

- ❖ most of calculation are based on **linear algebra op.**,
- ❖ efficient software exists like **BLAS, LAPACK, ATLAS,**
- ❖ **global matrix-vector** products can be easily computed at **element level** and back:

$$\mathbf{v} = \mathbf{S} \mathbf{p} \iff \mathbf{v}^{(e)} = \mathbf{S}^{(e)} \mathbf{p}^{(e)}$$

- ❖ element level op. can be done **element-by-element** (EBE) in any order or in **parallel**.

Parallel implementation

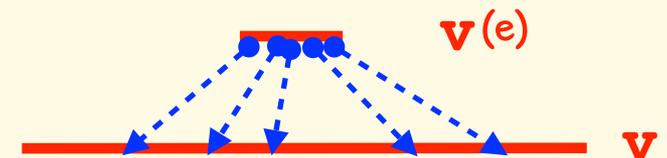
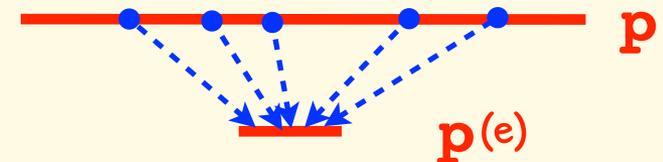


EBE algorithm

DO in parallel:

- ❖ **gather** data from global to local $\mathbf{p} \Rightarrow \mathbf{p}^{(e)}$,
- ❖ **local** matrix-vector multiply $\mathbf{v}^{(e)} = \mathbf{S}^{(e)}\mathbf{p}^{(e)}$,
- ❖ **scatter** data from local to global $\mathbf{v}^{(e)} \Rightarrow \mathbf{v}$,
- ❖ **synchronize** data at subdomain interfaces by MPI call.

REPEAT for each step.



Global seismology



SPECFEM3D

(D. Komatitsch, J. Tromp et al.)

High-Performance Computing



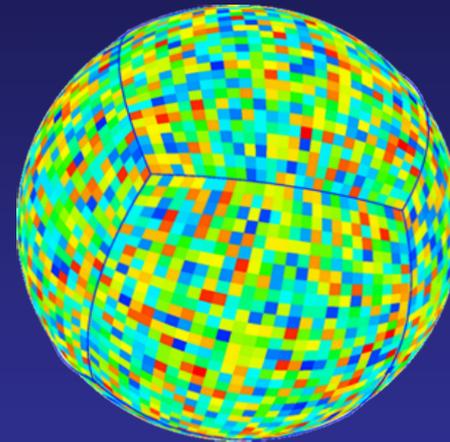
GPS Dell cluster



“Old” machine:

- 1024 nodes/2048 processors
- 3 TB of distributed memory
- 13.1 TFLOPS

6 n^2 mesh slices



New machine:

- 512 dual-processor quad-core nodes (4096 cores)
- 6 TB of distributed memory
- 22.6 TFLOPS
- Half the cooling & power

SPECFEM3D

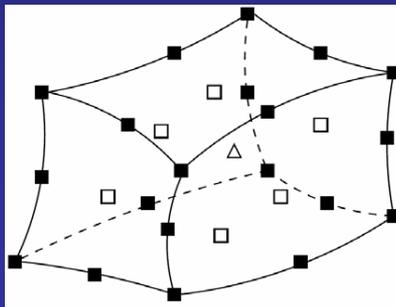
(D. Komatitsch, J. Tromp et al.)

Spectral-Element Method

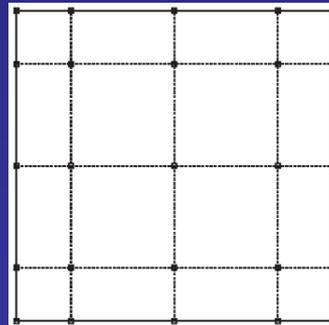


- Flexibility of the finite-element method
- Accuracy of a pseudospectral method
- Gauss-Lobatto-Legendre (GLL) quadrature
- Lagrange interpolants
- Diagonal mass matrix
- Explicit time integration

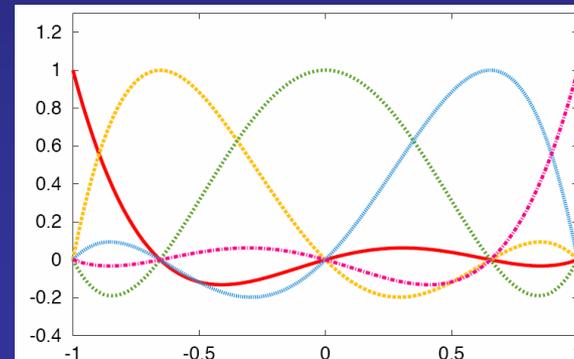
Hexahedral element



GLL integration points



Lagrange polynomials



Octree-based scalable adaptive framework



Omar Ghattas (UT Austin), T. Tu, H. Yu (CMU)

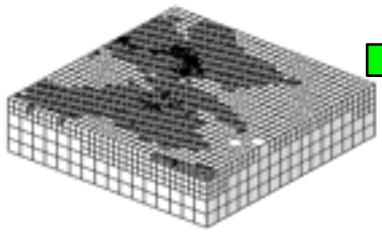
- Avoid scalability bottlenecks (serial algorithms, file I/O)
- Integrate meshing, partitioning, simulation and visualization in a **single parallel end-to-end application**
- All operations are done in parallel and in-core (no I/O)
- Online remote steering of the parallel process by GUI

Hercules: single, online, octree-based tool

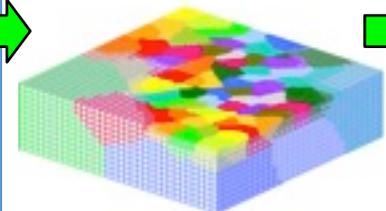


online Manipulation
online Visualization

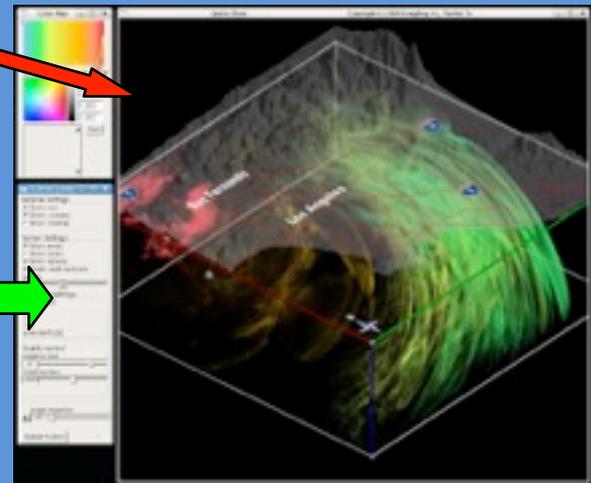
Meshing



Partitioner



Parallel
PDE
solver



Prospects for Seismic Inversion on Petaflop Systems

→ This talk is about parallel computing.

Kilo – 1,000

Mega – 1,000,000

Giga – 1,000,000,000

Tera – 1,000,000,000,000

Peta – 1,000,000,000,000,000

Flop – “Floating Point Operation”

Example Earthquake Simulation:

- 600km x 600km x 70km region
- Average velocity 2km/s, Max frequency 2Hz
- Wavelength 1km
- 10 variables per wavelength
- Simulated waves travel 400km
- Executing on average 10 arithmetic operations per variable
- 25 million grid boxes
- 25 billion variables
- 4000 time steps

25 billion x 4000 x 10 = 10^{15} → 1 Petaflop

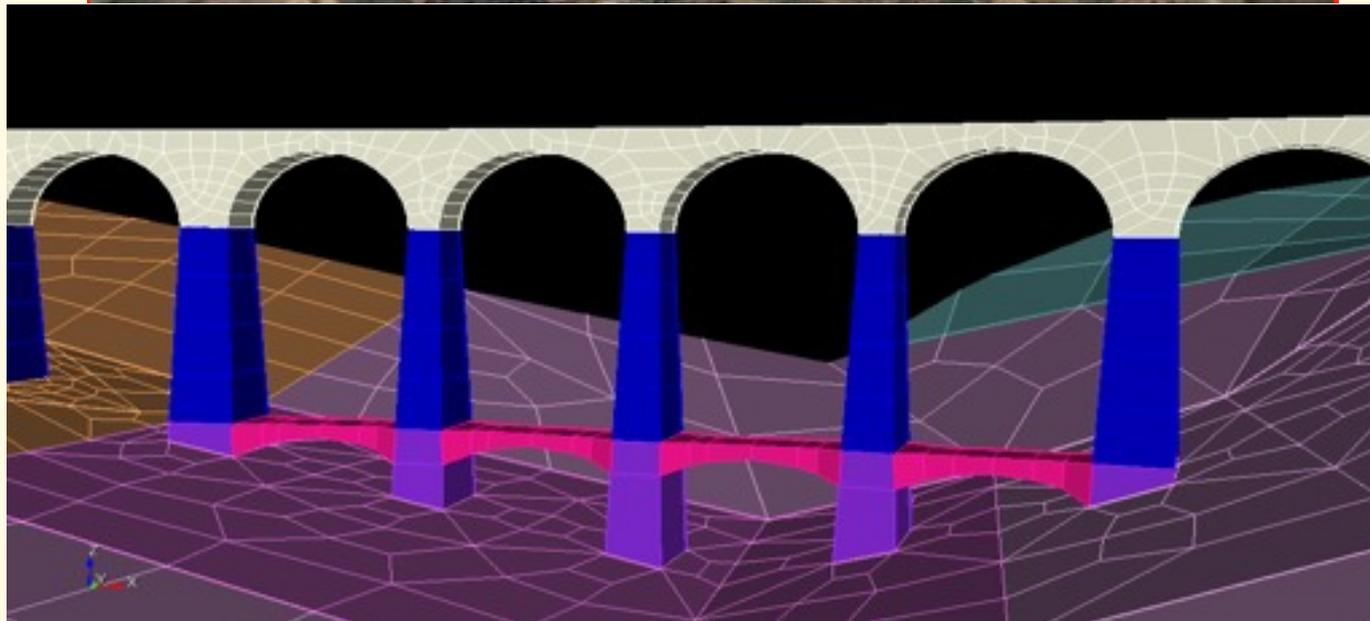
Examples



Acquansanta viaduct



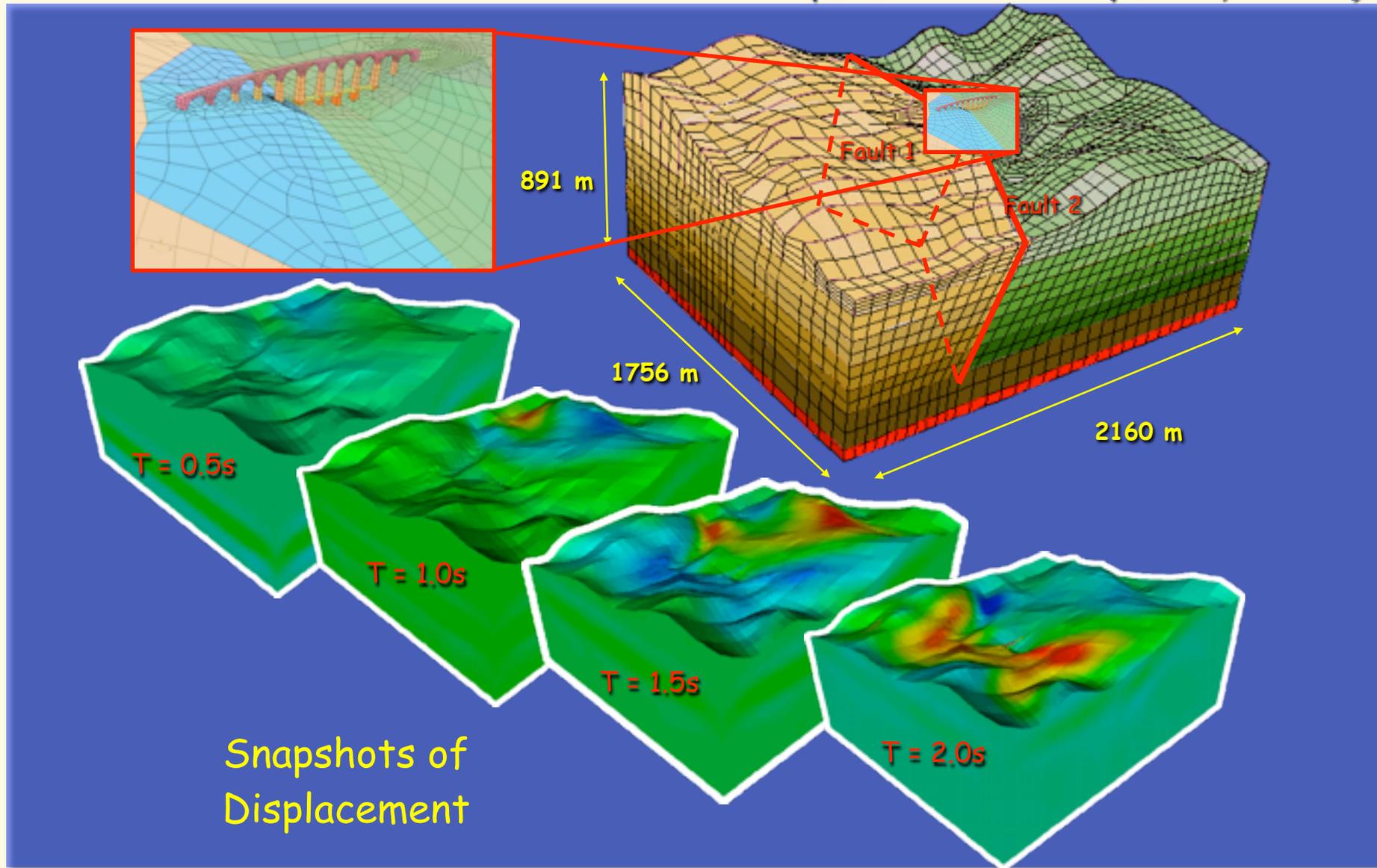
(GEOElse - M. Stupazzini, Polimi)



Acquansanta viaduct



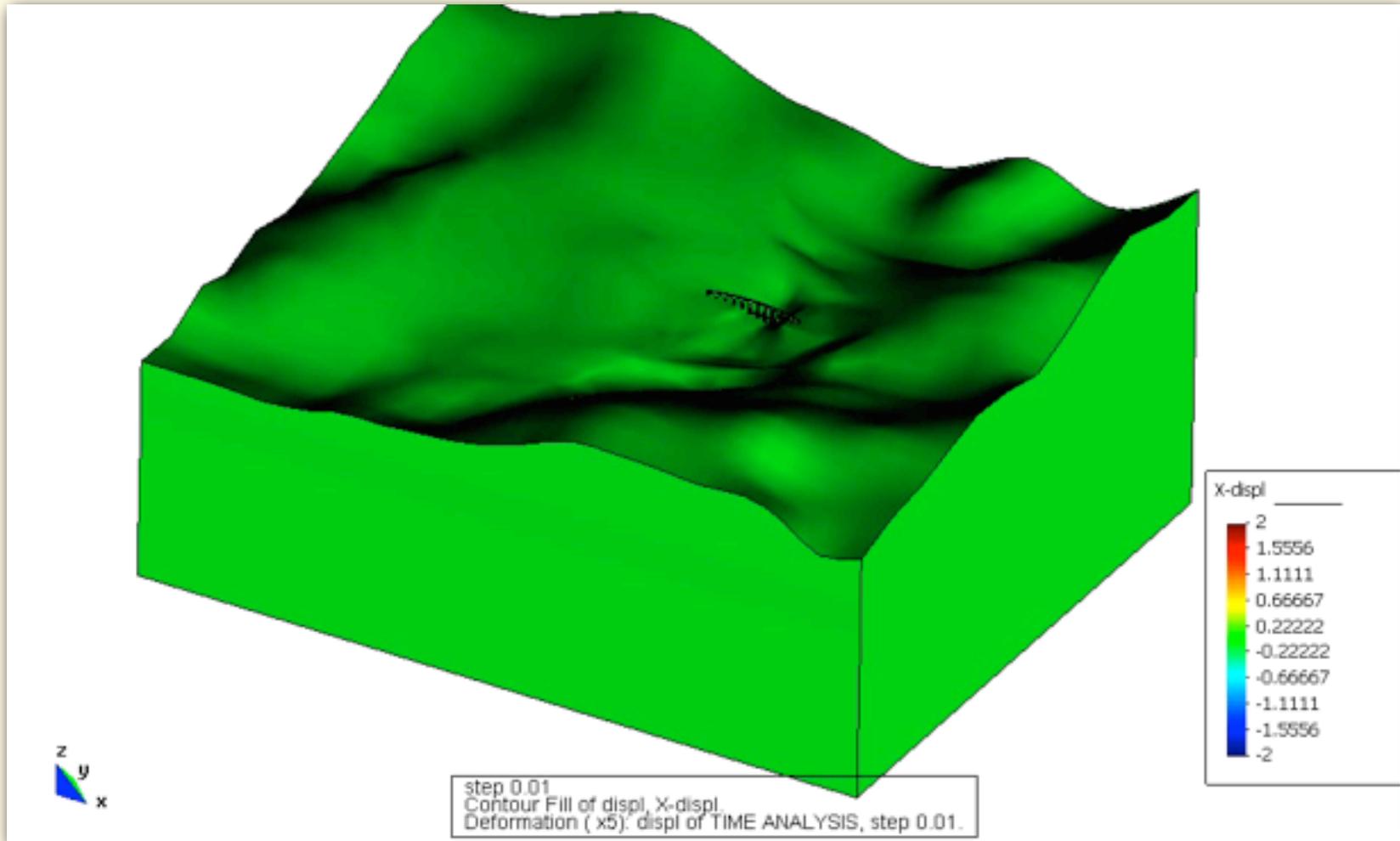
(GEOElse - M. Stupazzini, Polimi)



Acquansanta viaduct



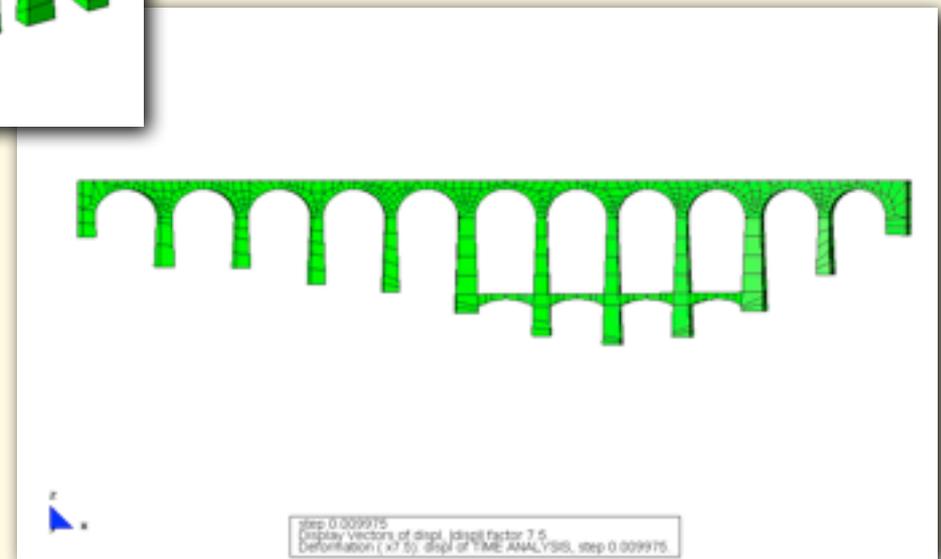
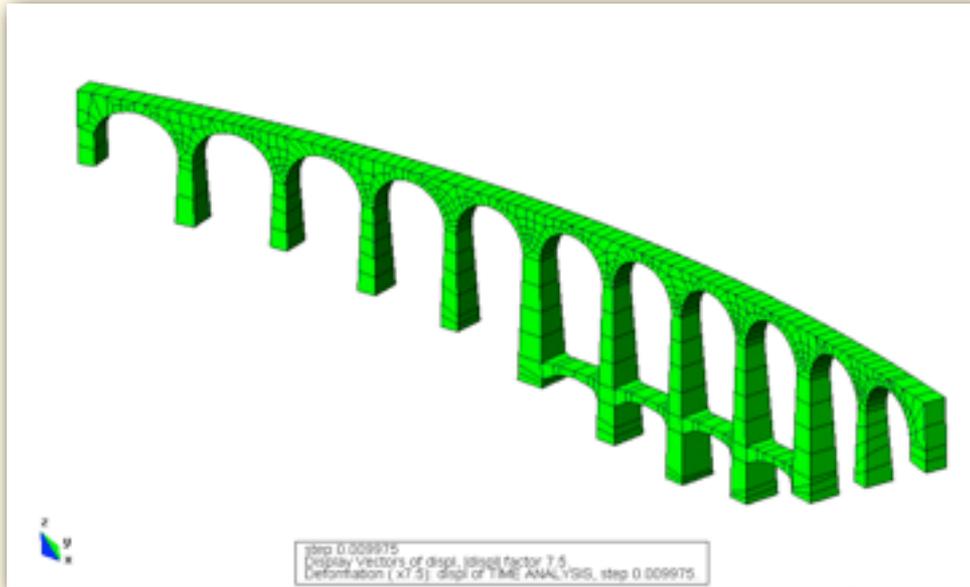
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Acquansanta viaduct



(GEOElse - M. Stupazzini, Polimi)



Thank
for your
attention!

