

Numerical models for earthquake ground motion

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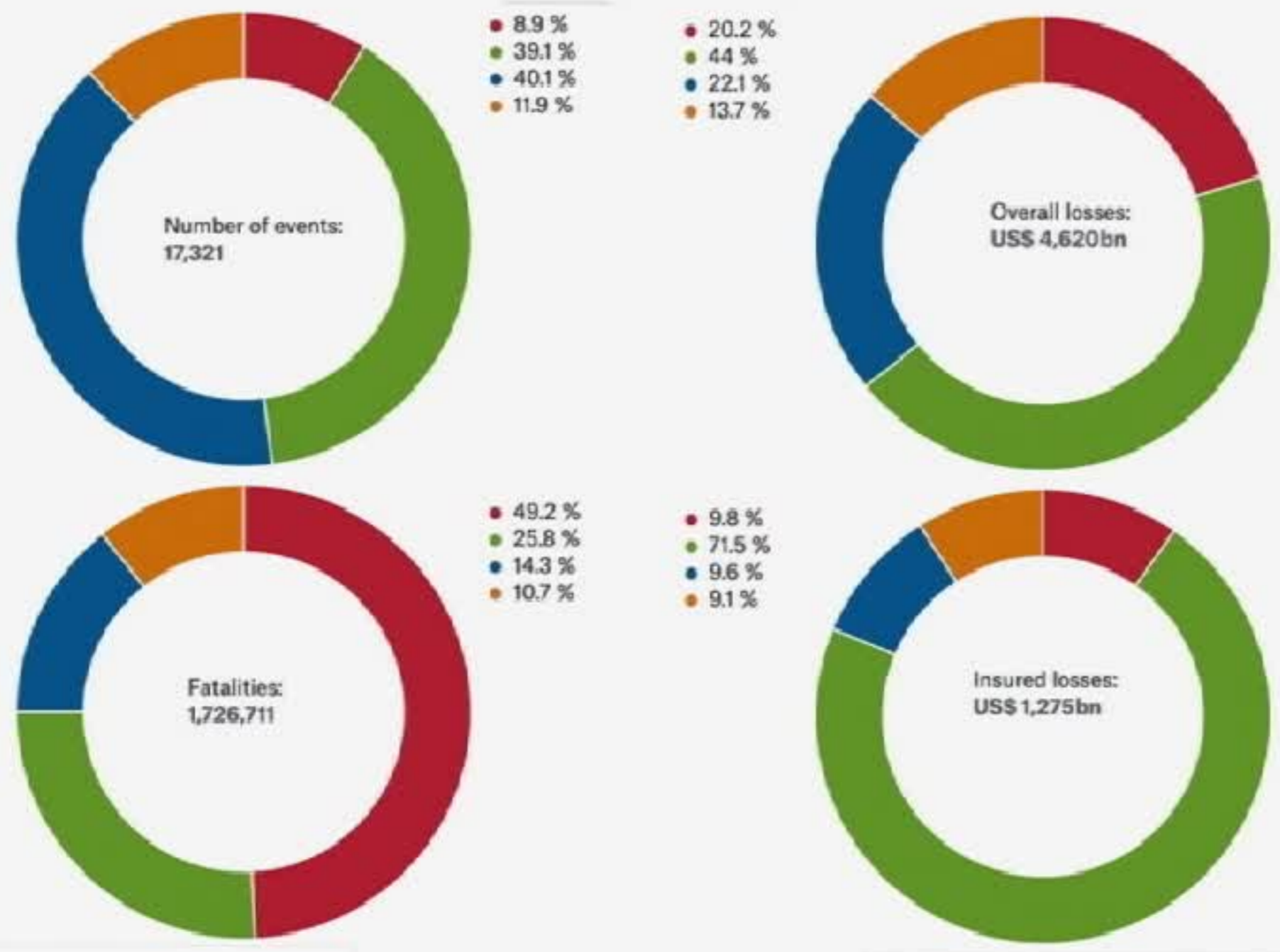


<http://speed.mox.polimi.it>



Percentage distribution for relevant natural loss events worldwide 1980 – 2017

NatCatSERVICE



- **Geophysical events**
(Earthquake, tsunami, volcanic activity)
- **Meteorological events**
(Tropical storm, extratropical storm, convective storm, local storm)
- **Hydrological events**
(Flood, mass movement)
- **Climatological events**
(Extreme temperature, drought, forest fire)

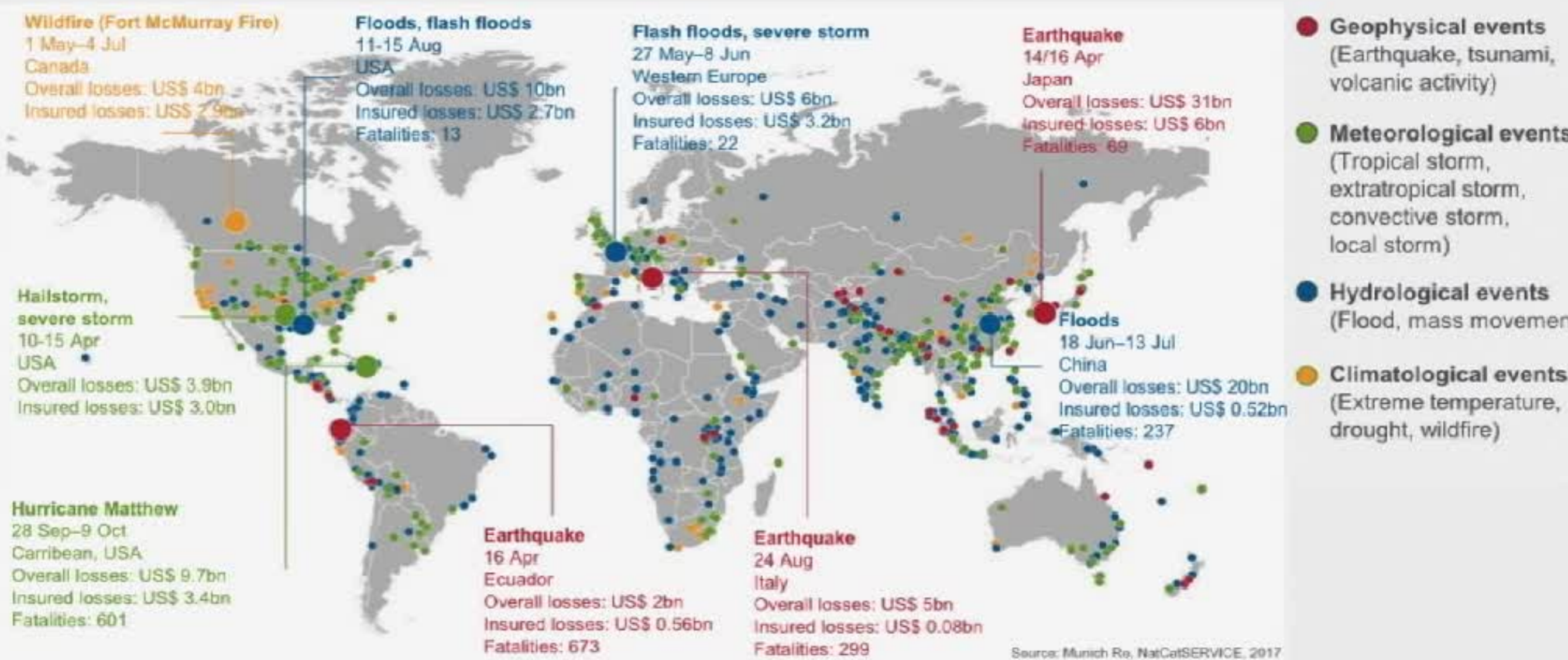
● Geophysical events ● Meteorological events ● Hydrological events ● Climatological events

Major events and losses in 2016

NatCatSERVICE

Loss events worldwide 2016 Geographical overview

Munich RE 



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10 Deadliest Events - Past 35 Years

NatCatSERVICE

Significant loss events worldwide 1980 – 2016

10 deadliest events

Date	Event	Affected area	Overall losses in US\$ m original values	Insured losses in US\$ m original values	Fatalities
26.12.2004	Earthquake, tsunami	Sri Lanka, Indonesia, Thailand, India, Bangladesh, Myanmar, Maldives, Malaysia	10,000	1,000	220,000
12.1.2010	Earthquake	Haiti	8,000	200	159,000
2-5.5.2008	Cyclone Nargis	Myanmar	4,000		140,000
29-30.4.1991	Tropical cyclone	Bangladesh	3,000	100	139,000
8.10.2005	Earthquake	Pakistan, India, Afghanistan	5,200	5	88,000
12.5.2008	Earthquake	China	85,000	300	84,000
July - Aug 2003	Heat wave	Europe	14,000	1,100	70,000
July - Sep 2010	Heat wave	Russian Federation			56,000
20.6.1990	Earthquake	Iran	7,100	100	40,000
26.12.2003	Earthquake	Iran	500	20	26,200

Source: Munich Re, NatCatSERVICE, 2017

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Earthquakes in a nutshell

An **earthquake** is the shaking of the surface of the Earth, resulting from the sudden release of energy in the Earth's lithosphere.

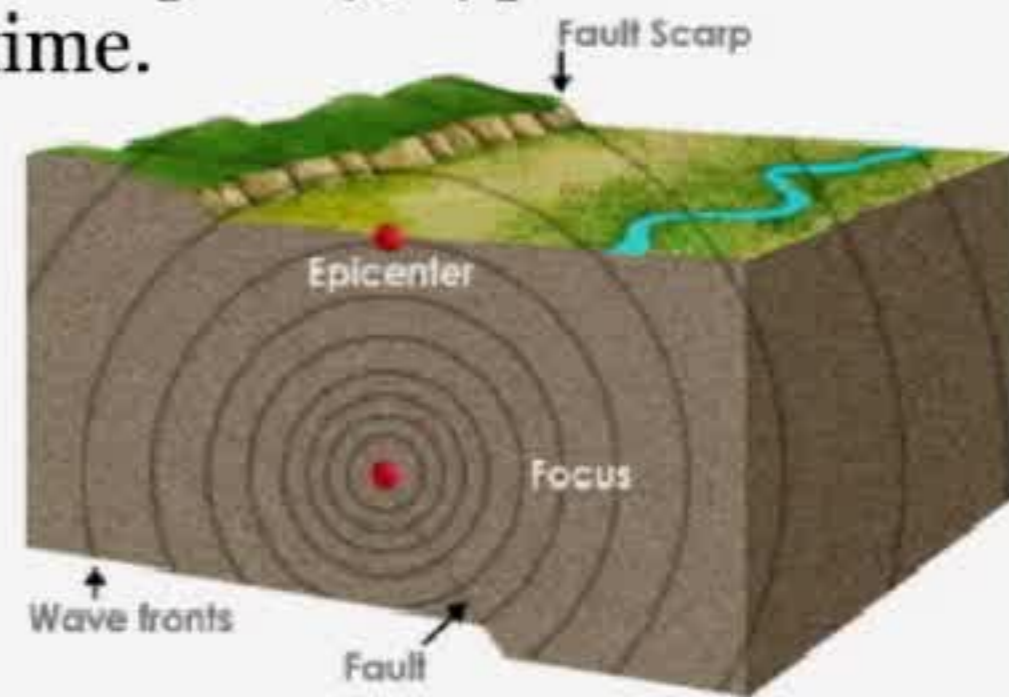
This energy has built up over long periods of time as a result of tectonic forces within the earth.

Sudden release of energy causes **seismic waves** to radiate from their point of origin through the earth. Seismic waves produce ground motion.

The **seismicity** of an area is expressed by the frequency, type and size of earthquakes experienced over a period of time.

Hypocenter (focus): earthquake's point of initial rupture.

Epicenter: the point at ground level directly above the hypocenter.

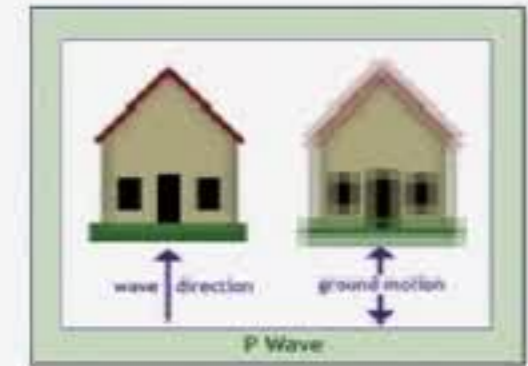


Geodynamics: P and S waves

P waves (compressional/primary waves)

The particles in the solid vibrate along the axis of propagation (the direction of motion) of the wave.

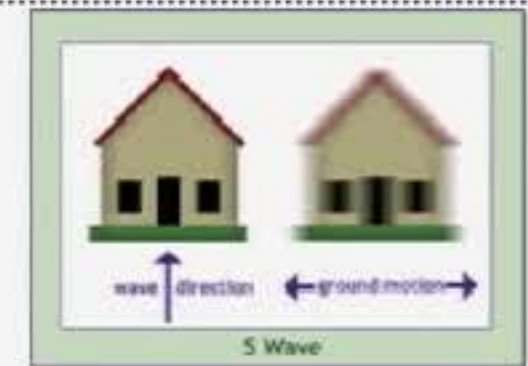
These waves can travel through any type of material, including fluids



S waves (shear/transverse waves)

The motion is perpendicular to the direction of wave propagation.

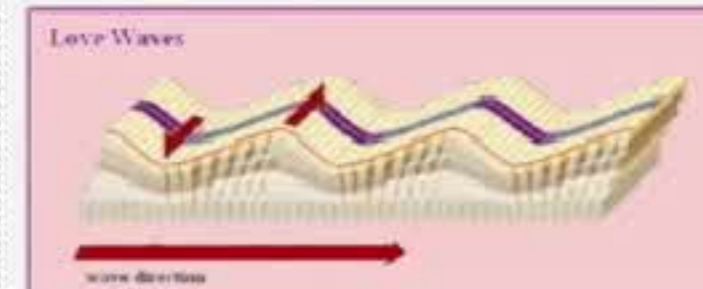
These waves can travel through solid media



Love waves

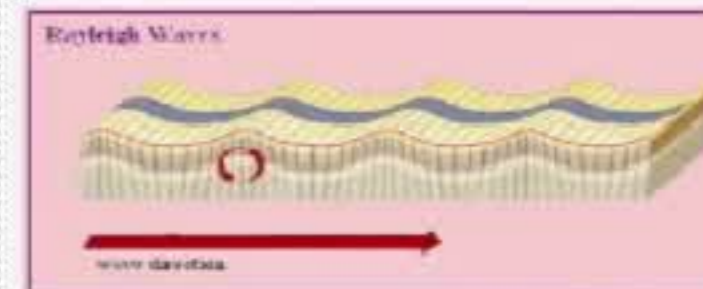
The particle motion forms a horizontal line perpendicular to the direction of propagation.

Travel with a lower velocity than P- or S- waves, but faster than Rayleigh waves

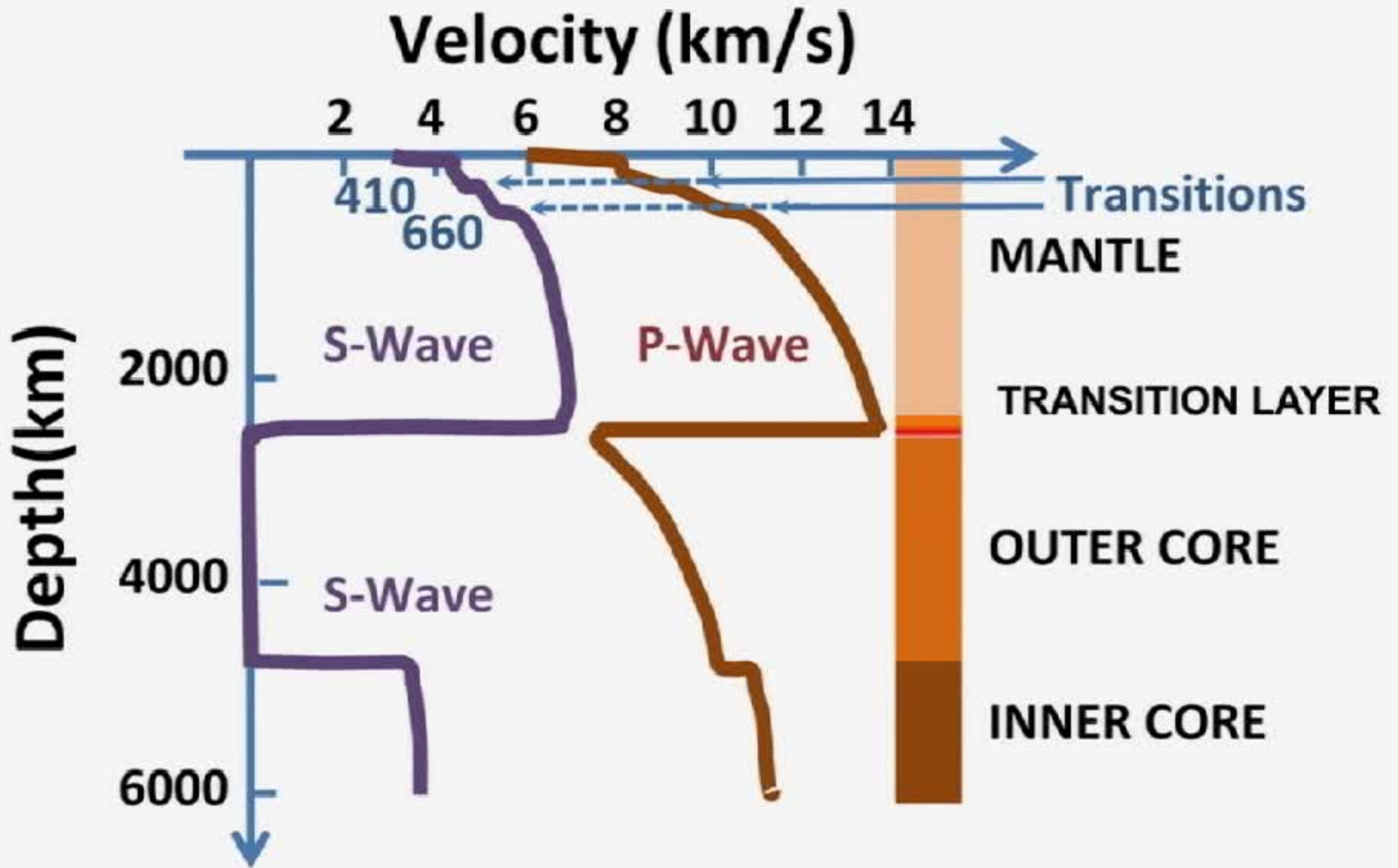


Rayleigh waves

In isotropic solids Rayleigh waves cause the surface particles to move in ellipses in planes normal to the surface and parallel to the direction of propagation



Speed of p and s waves



[Helfrich, Wood, "The Earth's Mantle", Nature, 2002]

Measuring the size of an earthquake

The **magnitude** is a number that characterises the relative size of an earthquake. It is based on measurement of the maximum motion recorded by a seismograph.

Different scales to measure earthquake magnitude:

the **moment magnitude** (M_w) **scale** is based on the concept of **seismic moment**. It is uniformly applicable to all sizes of earthquakes.

$$M_w = \frac{2}{3} \log_{10} M_0 - 10.7$$

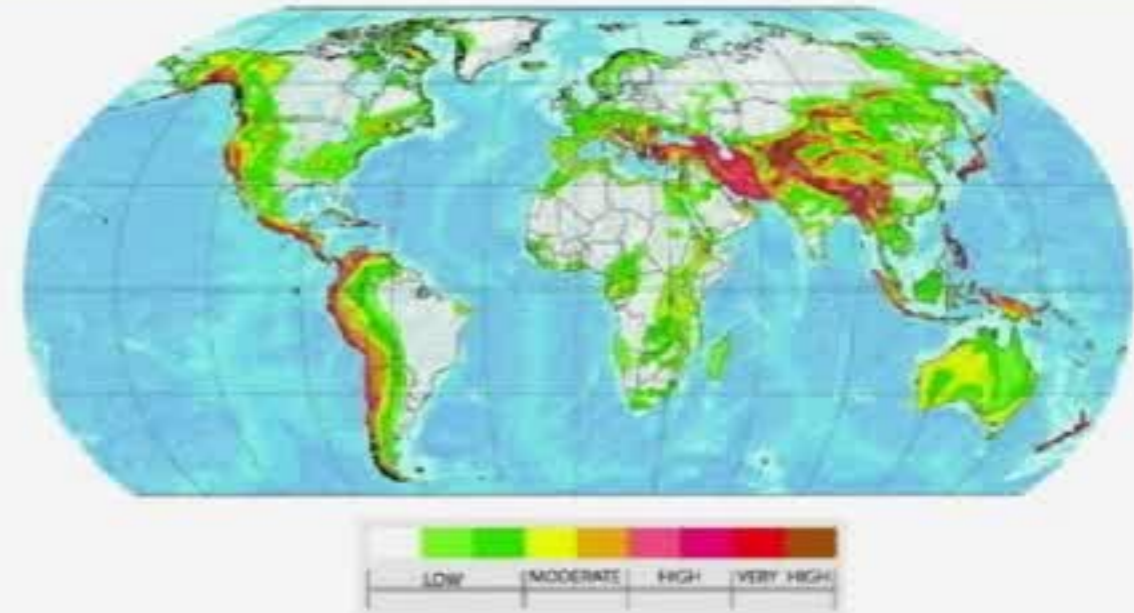
Seismic moment at the epicenter [N · m].
(~area of the rupture along the geologic fault where the earthquake occurred × average displacement)

An increase of one step on the logarithmic scale corresponds to a $10^{1.5} \approx 32$ times increase in the amount of energy released

The moment magnitude scale was introduced to address some shortcomings of the Richter scale while maintaining consistency for medium-sized earthquakes

Hazard, vulnerability, and exposure

Seismic hazard: probability that an earthquake will occur in a given geographic area, within a given window of time, and with ground motion intensity exceeding a given threshold.



Vulnerability

Seismic vulnerability: resistance of buildings to the effects of a seismic tremor (due to type, design, poor quality materials and construction methods, lack of maintenance).

Seismic exposure: possibility of damage, in economic terms, to cultural heritage or the loss of human lives

Exposure



Seismic risk



(See Parthenon's seismic risk analysis later)

Seismic risk: measurement of the damage expected in a given interval of time, determined by the combination of **hazard**, **vulnerability** and **exposure**

Overview of methods for Ground Motion Prediction - GMP

Level of complexity/specificity of input data

Detail of information required

Approaches for GMP

Output

Identification of the seismic source and its geometrical and seismological features (seismic moment, focal mechanism, max slip)

Definition of the propagation path in terms of seismic wave velocity, mass density, and quality factor profiles

Characterisation of the seismic source (kinematic/dynamic)

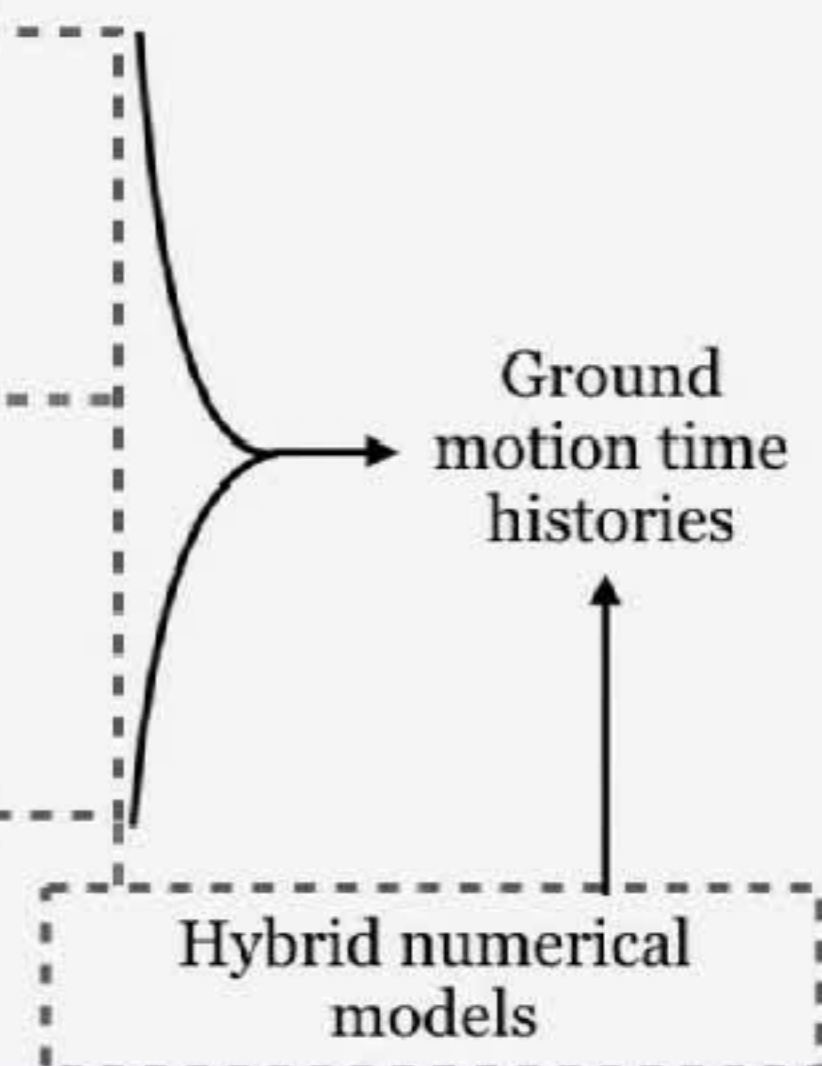
Characterisation of complex geological structures (basins, ridges, ...) that affect local seismic response

Ground motion prediction equations

Stochastic models

Empirical Green function

3D physics-based numerical models

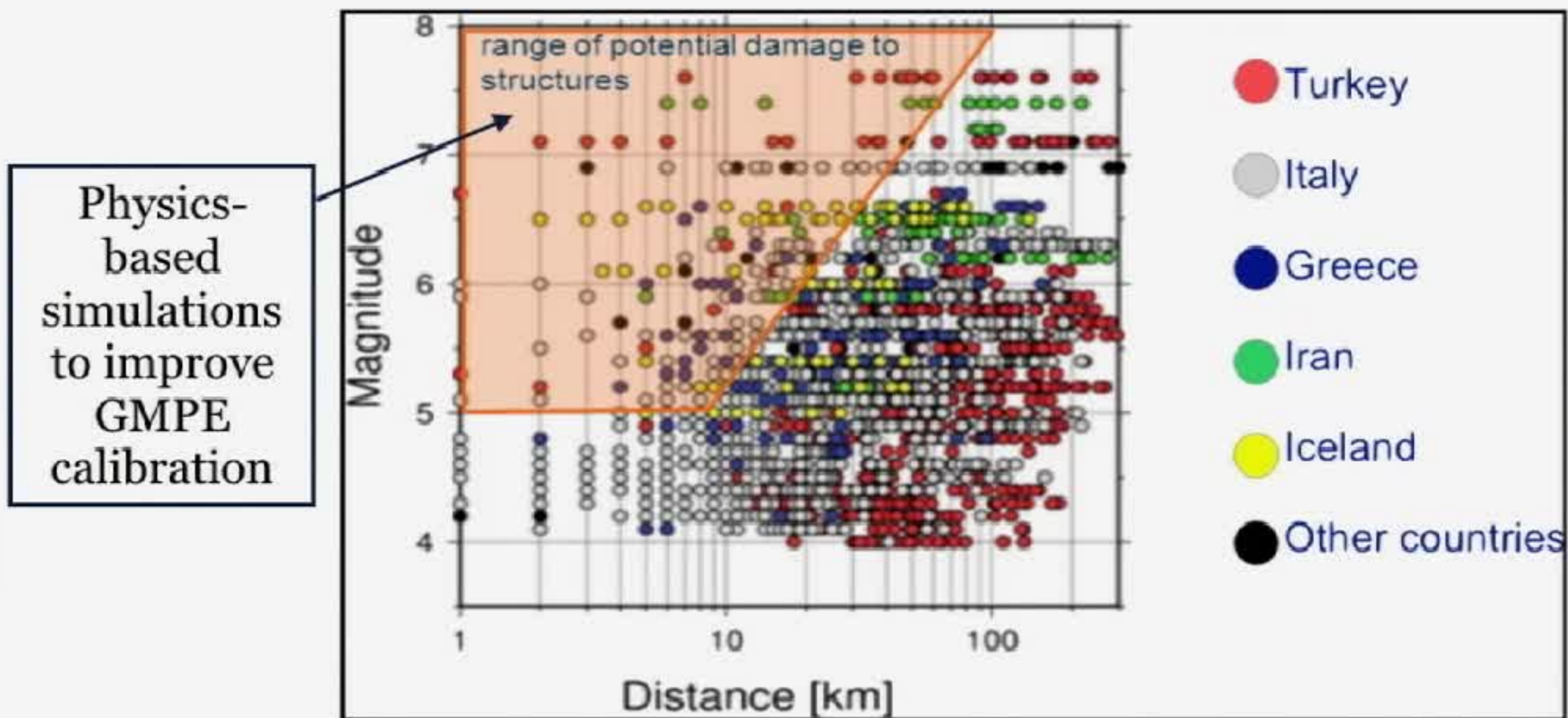


Ground motion parameters (PGD, PGV, S_d)

Ground motion time histories

One limitation of GMPEs

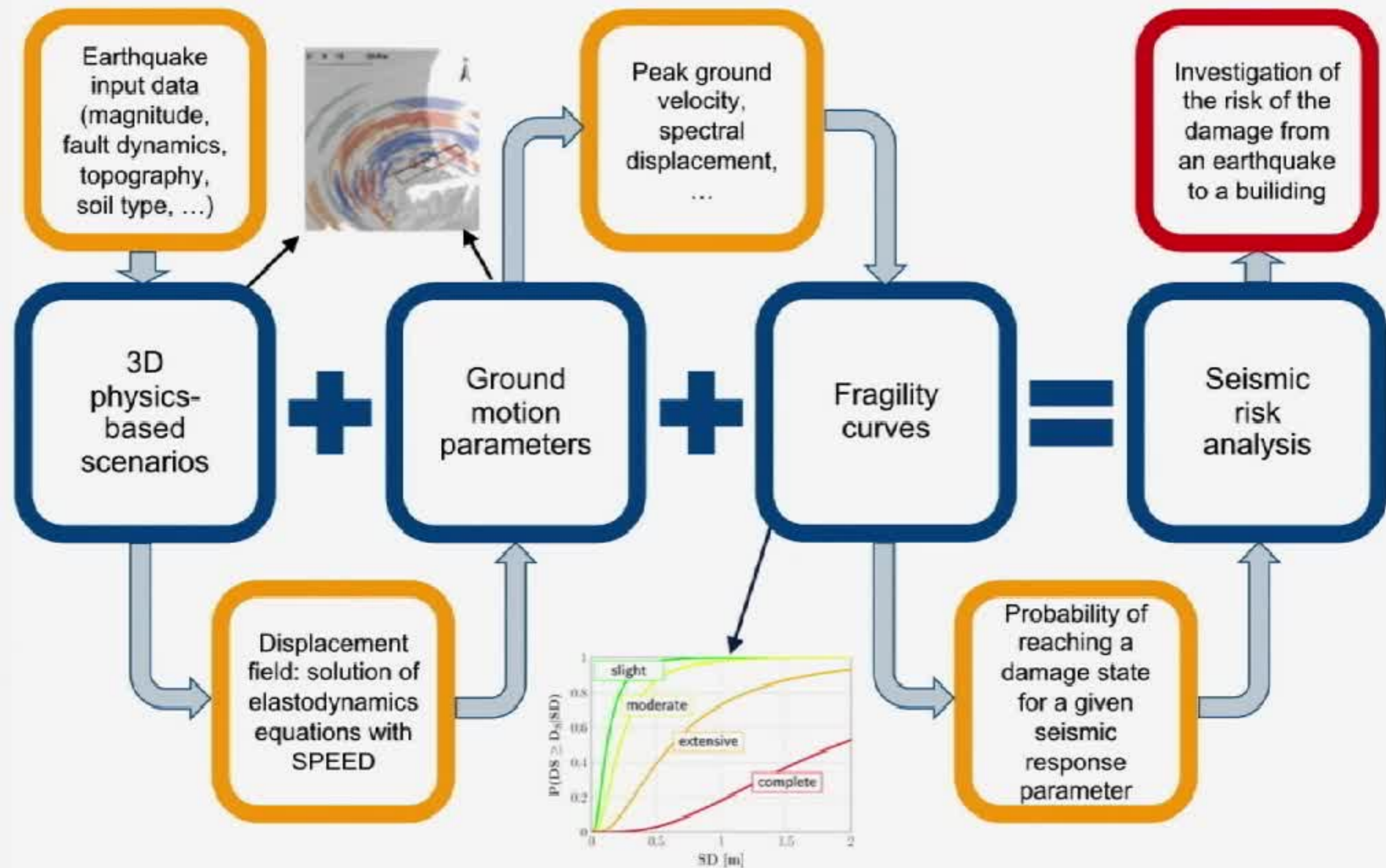
Recorded near-fault ground motions as a function of the **site distance from epicentre** (x-axis) and the **magnitude** (y-axis)



Magnitude and distance range covered by the ground motion database for calibration of pan-European ground motion prediction equations.

Main limitations of GMPEs: poor calibration in the near-source region

Workflow overview of seismic risk analysis



The mathematical model
and
its numerical approximation

The mathematical model

Governing equations for the displacement $\mathbf{u}(\mathbf{x}, t)$ of a dynamically disturbed elastic medium:

Law of
momentum
conservation

$$\rho \ddot{\mathbf{u}} - \nabla \cdot \underline{\sigma}(\mathbf{u}) + G(\mathbf{u}) = \mathbf{f} \quad \text{in } \Omega \times (0, T]$$

where

- \mathbf{u} is the displacement field
- ρ is the medium density

$$G(\mathbf{u}) = \begin{cases} \mathbf{0} & \text{fully elastic} \\ 2\rho\zeta\dot{\mathbf{u}} + \rho\zeta^2\mathbf{u} & \text{viscoelastic} \end{cases}$$

$\zeta \geq 0$ is a damping factor ($\sim 0.01s^{-1}$)

– Hookes' law

$$\underline{\sigma}(\mathbf{u}, t) = \underline{\mathbb{D}} \underline{\varepsilon}(\mathbf{u}) \equiv \lambda \text{tr}(\underline{\varepsilon}(\mathbf{u})) \underline{I} + 2\mu \underline{\varepsilon}(\mathbf{u}, t)$$

$\lambda = \lambda(\mathbf{x})$ and $\mu = \mu(\mathbf{x})$ are the first and second Lamé' elastic coefficients

– Non-linear elastic

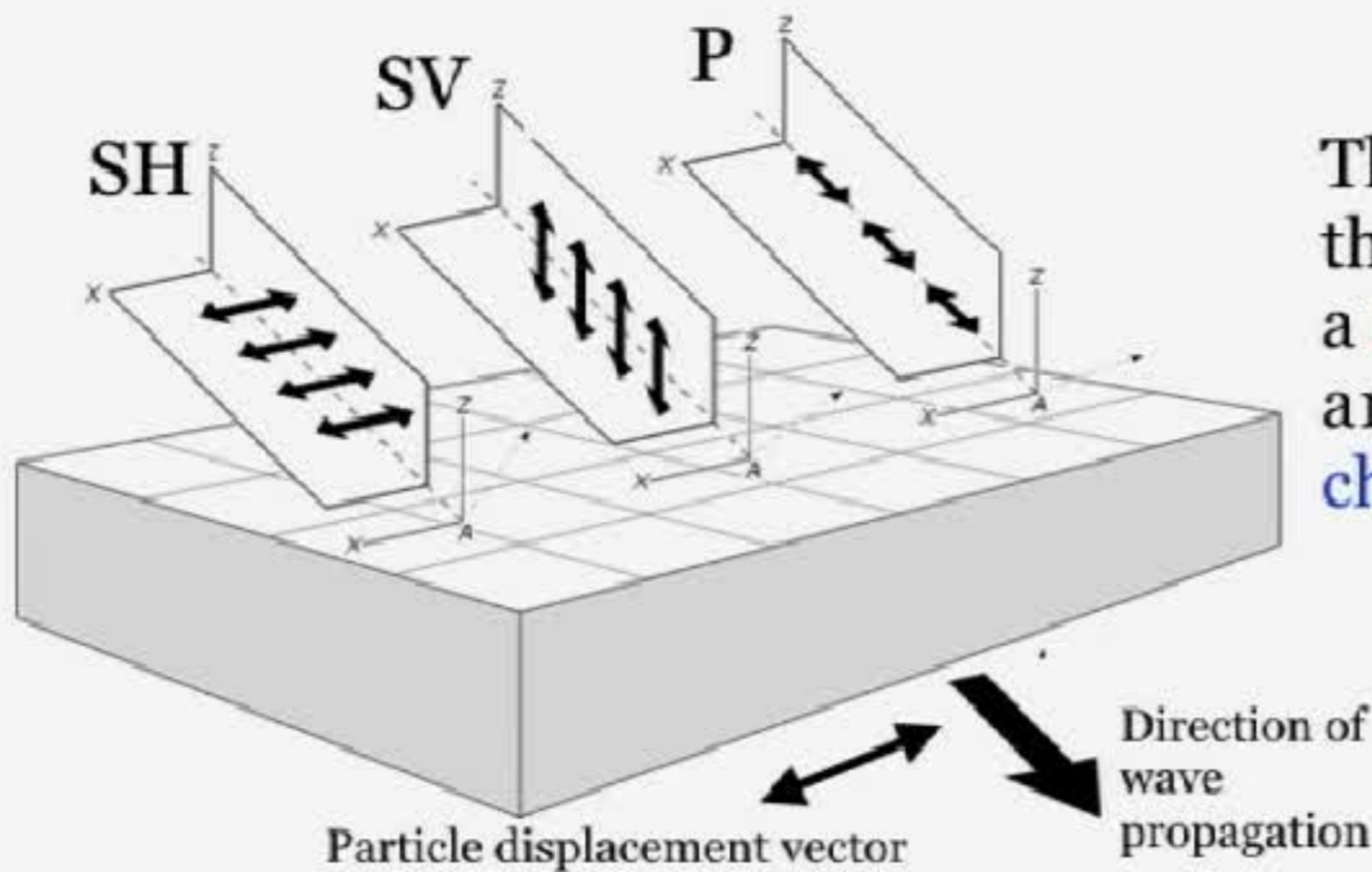
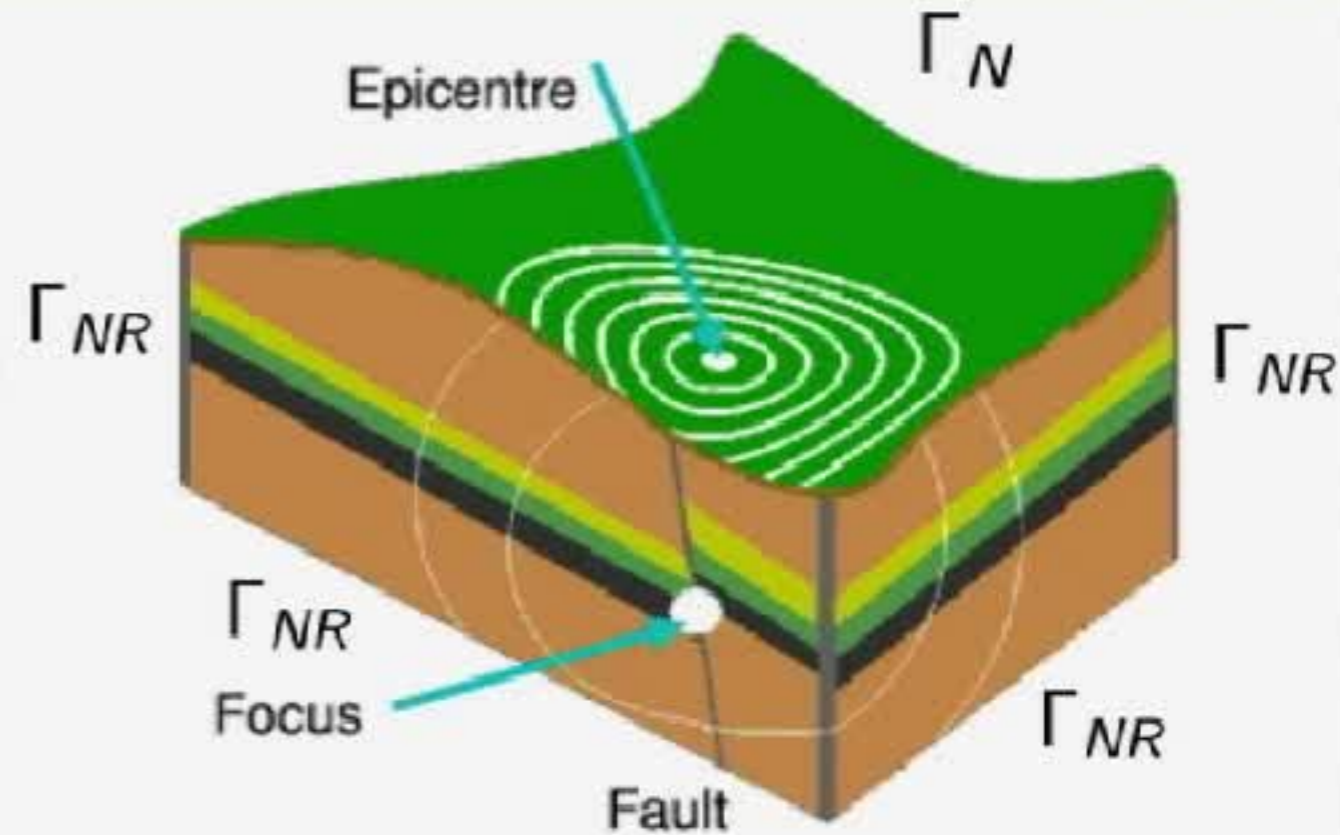
$$\underline{\sigma}(\mathbf{u}, t) = \underline{\mathbb{D}}(\lambda, \mu) \underline{\varepsilon}(\mathbf{u}) \longrightarrow \lambda = \lambda(\mathbf{x}) \quad \mu = \mu(\mathbf{x}, t, \underline{\varepsilon}(\mathbf{u}))$$

– Viscoelastic

$$\underline{\sigma}(\mathbf{u}, t) = \underline{\mathbb{D}}(\mathbf{x}, 0) \underline{\varepsilon}(\mathbf{u}, t) - \int_0^t \frac{\partial \underline{\mathbb{D}}}{\partial s}(\mathbf{x}, t - s) \underline{\varepsilon}(\mathbf{u}, s) ds$$

Computational domain and boundary conditions

$$\begin{cases} \nabla \cdot \underline{\sigma}(\mathbf{u})\mathbf{n} = \mathbf{t} & \text{on } \Gamma_N \times (0, T] \\ \text{Non reflecting BCs} & \text{on } \Gamma_{NR} \times (0, T] \end{cases}$$



The **seismic wavefield** that propagates through the (isotropic) Earth consists of a **P-wave** component and **two shear** (SV and SH) wave components; their **characteristic speed** is respectively

$$c_P = \sqrt{\frac{\lambda + 2\mu}{\rho}}, \quad c_S = \sqrt{\frac{\mu}{\rho}}$$

For any time $t \in (0, T]$ find $\mathbf{u} \in \mathbf{V} = \mathbf{H}^1(\Omega)/\mathbb{R}$ such that

$$(\rho \ddot{\mathbf{u}}, \mathbf{v})_{\Omega} + \mathcal{A}(\mathbf{u}, \mathbf{v}) + (G(\mathbf{u}), \mathbf{v})_{\Omega} = \mathcal{F}(\mathbf{v}) \quad \forall \mathbf{v} \in \mathbf{V}$$

supplemented with initial conditions $\mathbf{u}(0) = \mathbf{u}^0$ and $\dot{\mathbf{u}}(0) = \mathbf{v}^0$

$$\mathcal{A}(\mathbf{u}, \mathbf{v}) = (\underline{\sigma}(\mathbf{u}), \underline{\varepsilon}(\mathbf{v}))_{\Omega}$$

$$\mathcal{F}(\mathbf{v}) = (\mathbf{f}, \mathbf{v})_{\Omega} + \langle \mathbf{t}, \mathbf{v} \rangle_{\Gamma_N}$$

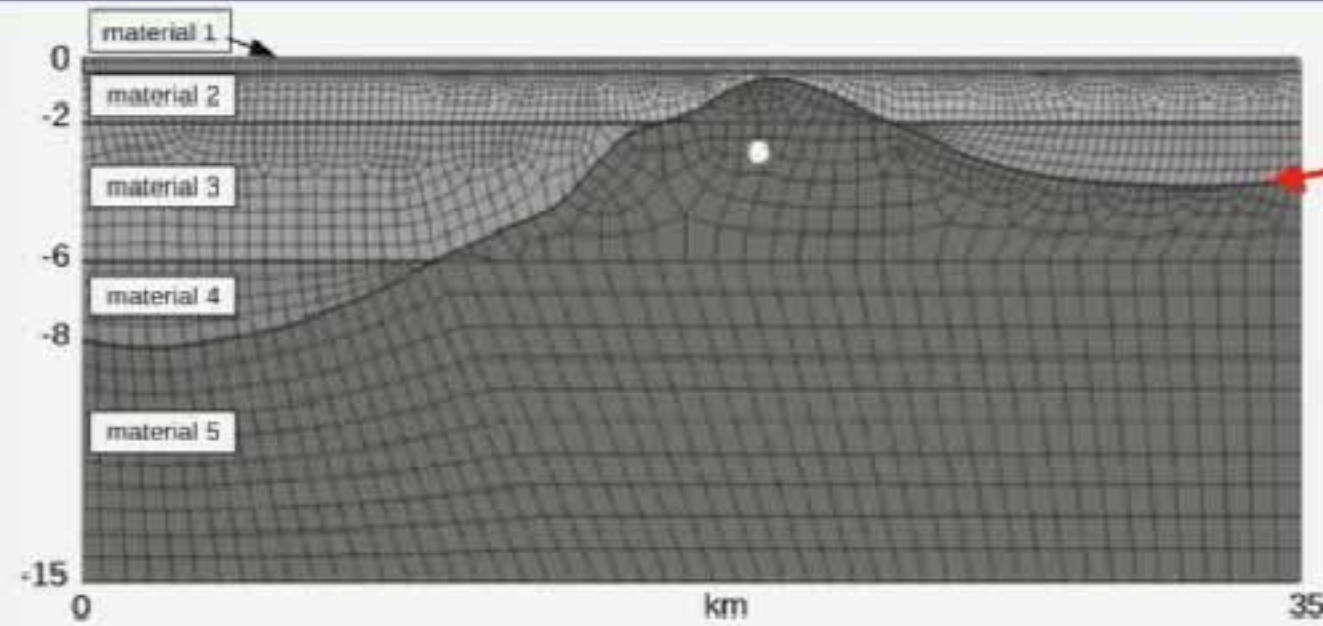
Up to “non-reflecting BCs terms”

Requirements on the numerical solution

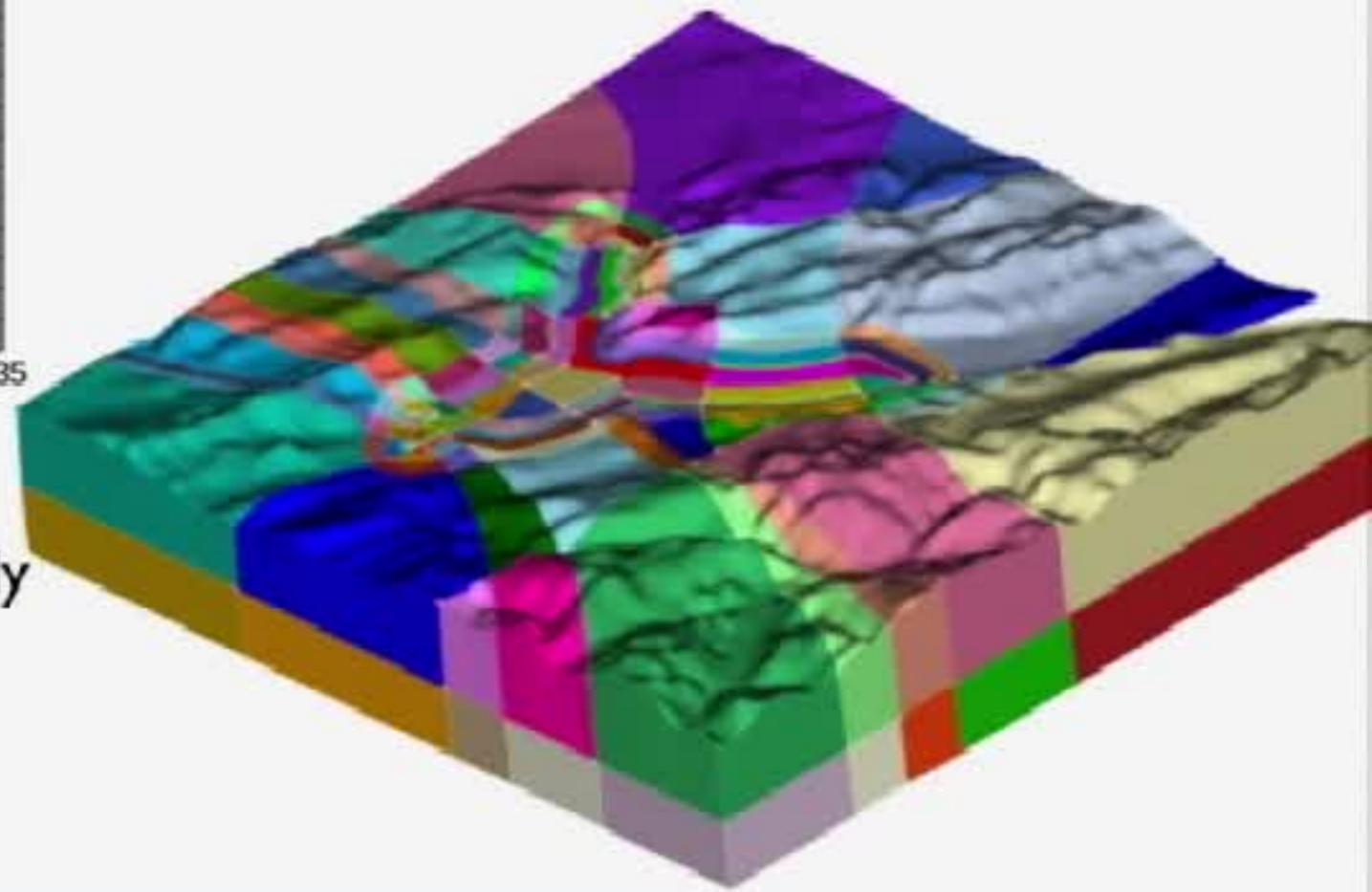
- Accurate description of the behaviour at material interfaces
⇒ high-order accuracy
- Waves are typically propagated over many periods of time
⇒ control the numerical dispersion and dissipation errors
- Complex geometries and strong contrasts in wave speeds
⇒ methods that accommodate non-conforming grids
- The size of the bodies excited is large relative to the wavelengths of interests
⇒ efficient and scalable implementation for parallel computing

**Discontinuous
Galerkin
Spectral
Element
methods
(DGSEM)**

Mesh partition



“DG faces” \mathcal{F}_h



Ω is partitioned into macro-regions Ω_ℓ

Each macro-region is meshed independently by a conforming hexahedral/tetrahedral partition \mathcal{T}_{h_ℓ}

DG paradigm used at interfaces

A function in V_{DG} is

a polynomial of degree $N_\ell \geq 1$ in each mesh-element of \mathcal{T}_{h_ℓ} ,
continuous in each macro-region,
discontinuous across the skeleton

Continuous in time approximation

For any time $t \in (0, T]$ find $\mathbf{u}_h \in \mathbf{V}_h$ such that

$$(\rho \ddot{\mathbf{u}}_h, \mathbf{v}_h)_\Omega + \mathcal{A}_h(\mathbf{u}_h, \mathbf{v}_h) + (\mathcal{G}(\mathbf{u}_h), \mathbf{v}_h)_\Omega = \mathcal{F}_h(\mathbf{v}_h) \quad \forall \mathbf{v}_h \in \mathbf{V}_h$$

supplemented with initial conditions $\mathbf{u}_h(0) = \mathbf{u}_h^0$ and $\dot{\mathbf{u}}_h(0) = \mathbf{v}_h^0$

$$\mathcal{A}_h(\mathbf{u}_h, \mathbf{v}_h) = \sum_{\Omega_\ell} (\underline{\sigma}(\mathbf{u}_h), \underline{\varepsilon}(\mathbf{v}_h))_{\Omega_\ell} + \langle \{\{\underline{\sigma}(\mathbf{u}_h)\}\}, [\mathbf{v}_h] \rangle_{\mathcal{F}_h}$$

$$+ \langle [\mathbf{u}_h], \{\{\underline{\sigma}(\mathbf{v}_h)\}\} \rangle_{\mathcal{F}_h} + \langle \eta [\mathbf{u}_h], [\mathbf{v}_h] \rangle_{\mathcal{F}_h}$$

Jump

Average

$$\mathcal{F}_h(\mathbf{v}_h) = \sum_{\Omega_\ell} (\mathbf{f}, \mathbf{v}_h)_{\Omega_\ell} + \langle \mathbf{t}, \mathbf{v}_h \rangle_{\mathcal{F}_h^N}$$

$$\eta \approx \alpha \{\{\mathbb{D}\}\} \left\{ \left\{ \frac{N_\ell^2}{h_\ell} \right\} \right\}$$

α large enough

Stability

Let $\mathbf{u}_h(t)$ be the continuous in time approximate solution (with $\mathbf{t} = \mathbf{0}$, for simplicity). Then

$$\|\mathbf{u}_h(t)\|_{\mathcal{E}}^2 \lesssim \|\mathbf{u}_h(0)\|_{\mathcal{E}}^2 + \int_0^t \rho_*^{-1} \|\mathbf{f}(\tau)\|_{L^2(\Omega)} d\tau \quad 0 < t \leq T$$

$$\begin{aligned} \|\mathbf{v}(t)\|_{\mathcal{E}}^2 &= \|\rho^{1/2} \dot{\mathbf{v}}(t)\|_{L^2(\Omega)}^2 + \|\rho^{1/2} \zeta \mathbf{v}(t)\|_{L^2(\Omega)}^2 \\ &\quad + \sum_{\ell} \|\mathbb{D}^{1/2} \underline{\underline{\varepsilon}}(\mathbf{v}(t))\|_{L^2(\Omega_{\ell})}^2 + \|\eta^{1/2} \llbracket \mathbf{v}(t) \rrbracket\|_{L^2(\mathcal{F}_h)}^2 \end{aligned}$$

[Antonietti, Ayuso, Mazzieri, Quarteroni, JSC, 2016],[Antonietti, Ferroni, Mazzieri, Quarteroni, LNCES, 2017], [Antonietti, Mazzieri, CMAME, 2018]

Error estimates

$$\sup_{t \in [0, T]} \|\mathbf{u}(t) - \mathbf{u}_h(t)\|_{\mathcal{E}}^2 \lesssim \sum_{\Omega_\ell} C_\ell(T, \mathbf{u}, \dot{\mathbf{u}}, \ddot{\mathbf{u}}) \frac{h_\ell^{2 \min(s_\ell, N_\ell + 1) - 2}}{N_\ell^{2s_\ell - 3}}$$

If $h_\ell \approx h$, $N_\ell = N$, and $s_\ell = s \geq N + 1$ for any $\ell = 1, 2, \dots$

$$\sup_{t \in [0, T]} \|\mathbf{u}(t) - \mathbf{u}_h(t)\|_{\mathcal{E}}^2 \lesssim C(T, \mathbf{u}, \dot{\mathbf{u}}, \ddot{\mathbf{u}}) \frac{h^{2N}}{N^{2s-3}}$$

- Large enough penalty parameter
- **Optimal** rate of convergence with respect to \mathbf{h}
- **Suboptimal** (by a factor $N^{1/2}$) rate of convergence with respect to \mathbf{N} (known for DG methods)

Fully discrete formulation

$$M\ddot{U}(t) + C\dot{U}(t) + AU(t) = F(t),$$

$$U(0) = 0 \text{ and } \dot{U}(0) = 0.$$

leapfrog \rightarrow

$$\ddot{U}(t_n) \approx \frac{U^{n+1} - 2U^n + U^{n-1}}{\Delta t^2}, \quad \dot{U}(t_n) \approx \frac{U^{n+1} - U^{n-1}}{2\Delta t}$$

$$\left(M + \frac{\Delta t}{2}C\right)U^{n+1} = \Delta t^2(F^n - AU^n) + 2MU^n + \left(\frac{\Delta t}{2}C - M\right)U^{n-1}, \quad n = 1, \dots, N_T - 1$$

Newmark \rightarrow

$$B(t) = M^{-1}(F(t) - C\dot{U}(t) - AU(t))$$

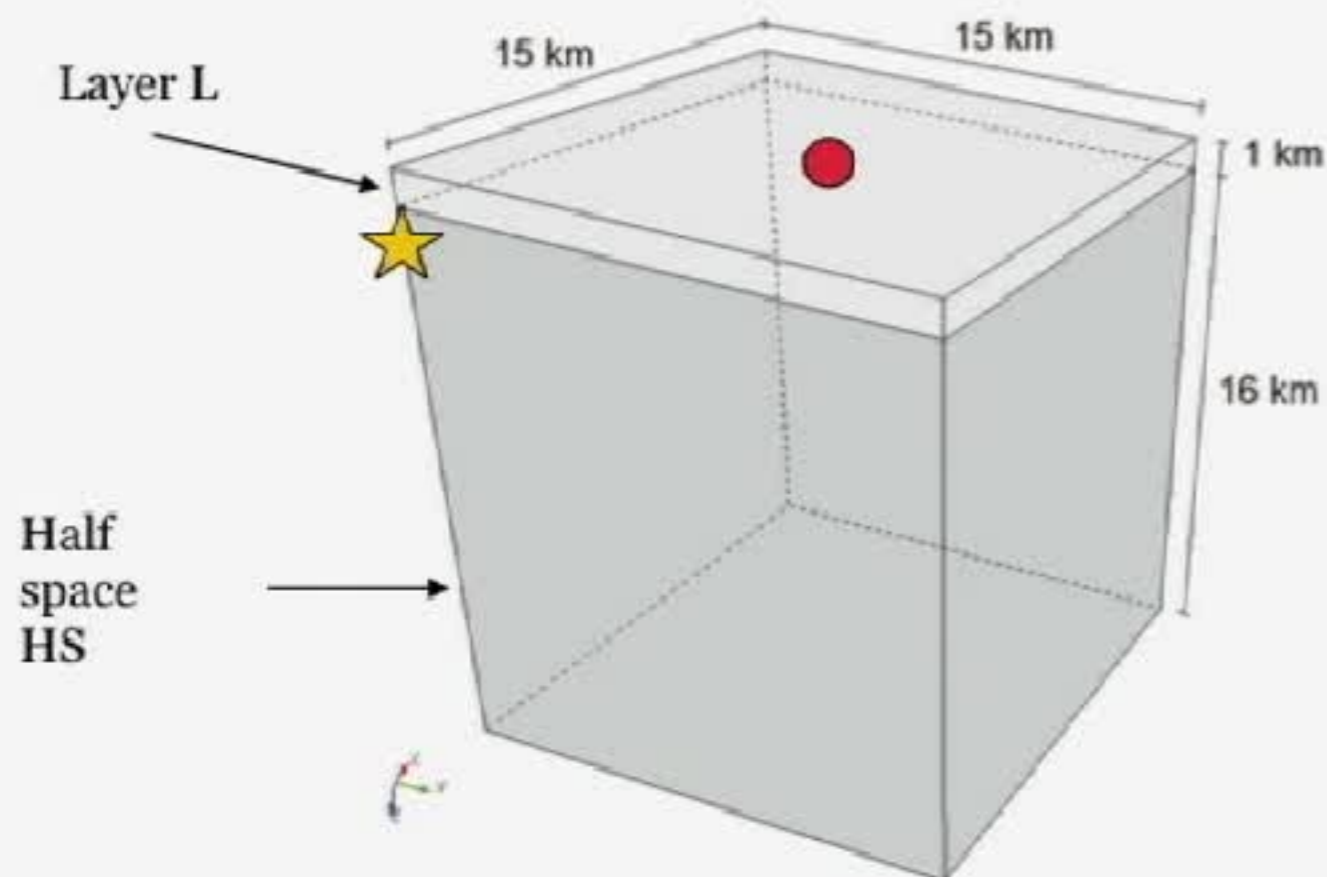
$$\begin{cases} U^{n+1} = U^n + \Delta t\dot{U}^n + \Delta t^2 [\xi B^{n+1} + (1/2 - \xi)B^n] \\ \dot{U}^{n+1} = \dot{U}^n + \Delta t [\theta B^{n+1} + (1 - \theta)B^n] \end{cases}$$

$$n = 1, \dots, N_T - 1$$

Adaptive time-integration methods (see conclusions)

Verification: layer over halfspace

- $\Omega = [-30, 30] \times [-30, 30] \times [0, 17]$ km
- Seismic moment in $S = (0, 0, 2)$ km ★
- Receiver $R = (6, 8, 0)$ km ●



1 of 4 symmetric quadrants

$$\mathbf{f}(\mathbf{x}, t) = -\nabla \cdot \delta(\mathbf{x} - \mathbf{x}_S)g(t)$$

$$g(t) = M_0 (t/t_0^2) \exp(-t/t_0)$$

$$M_0 = 10^8 \text{ [Nm]}$$

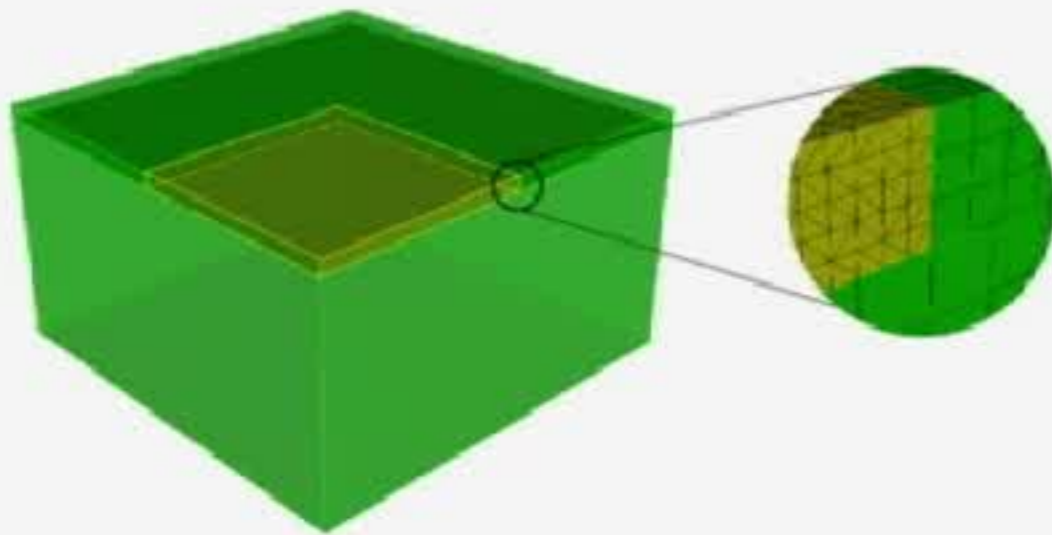
$$t_0 = 0.1 \text{ [s]}$$

Moment time history

Layer	Depth [m]	c_P [m/s]	c_S [m/s]	ρ [kg/m ³]
L	0-1000	4000	2000	2600
HS	1000-17000	6000	3464	2700

[Day et al. Bulletin of the Seismological Society of America 2001]

Verification: layer over halfspace

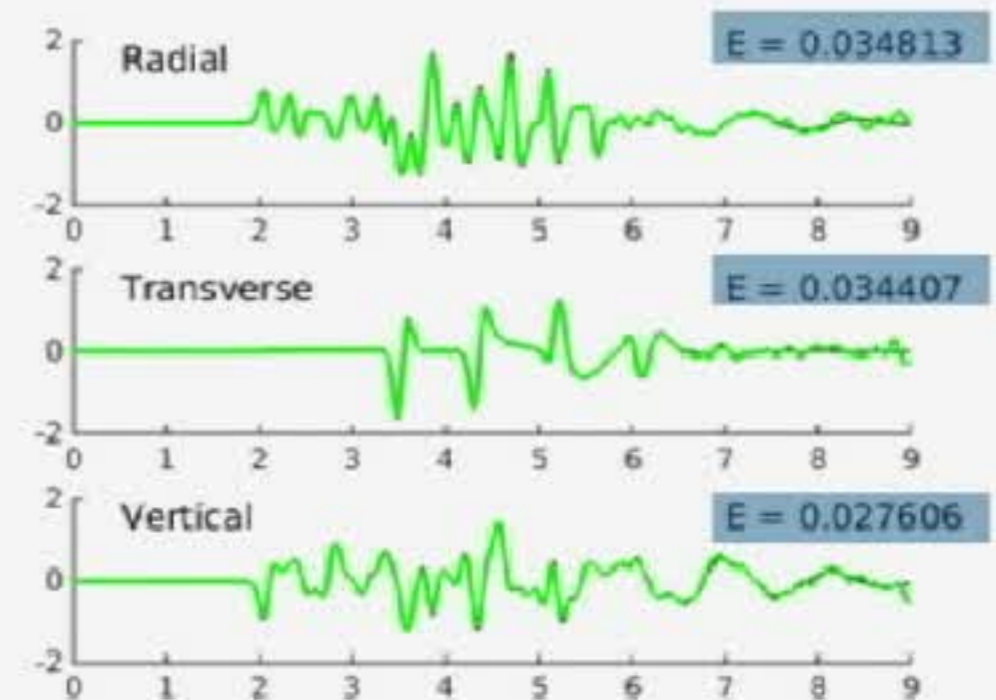
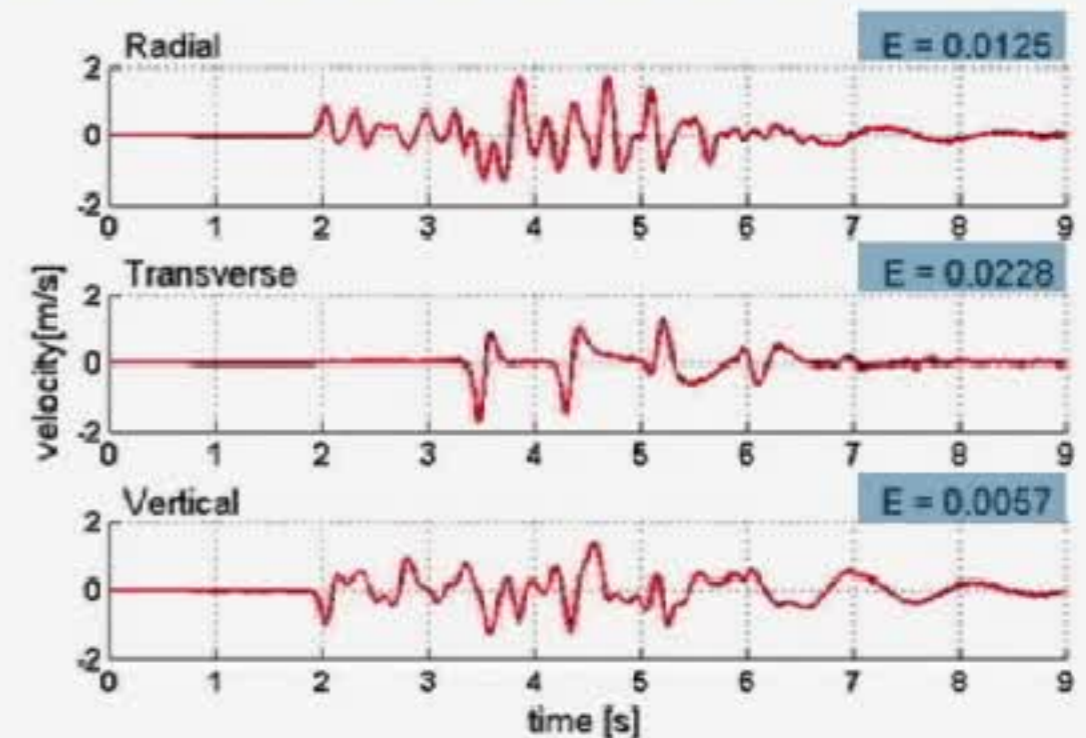


Model	El.	N	d.o.f.	Δt
Hexa-C	814833	4	≈ 150 mln	$3 \cdot 10^{-4}$
Hexa-NC	70228	5	≈ 30 mln	$5 \cdot 10^{-4}$
Hexa-Tetra	86141	5-4	≈ 30 mln	$5 \cdot 10^{-4}$

Relative seismogram misfit

$$E = \frac{\sum_{i=1}^{N_r} (\mathbf{u}_h(t_i) - \mathbf{u}(t_i))^2}{\sum_{i=1}^{N_r} \mathbf{u}(t_i)^2}$$

Hexa-C provide same results as Hexa-NC



Comparison between the semi-analytic solution (black line) and the numerical one (colored line)

3D Grid dispersion and dissipation: plane wave analysis

In an infinite elastic medium free from body forces, the displacement field is governed by the equation

$$\rho \ddot{\mathbf{u}} - \nabla \cdot \underline{\underline{\sigma}}(\mathbf{u}) = \mathbf{0}$$

We seek the solution in the form of a **plane wave**:

$$\mathbf{u}(\mathbf{x}, t) = \mathbf{A} e^{i(\mathbf{k} \cdot \mathbf{x} - \omega t)}$$

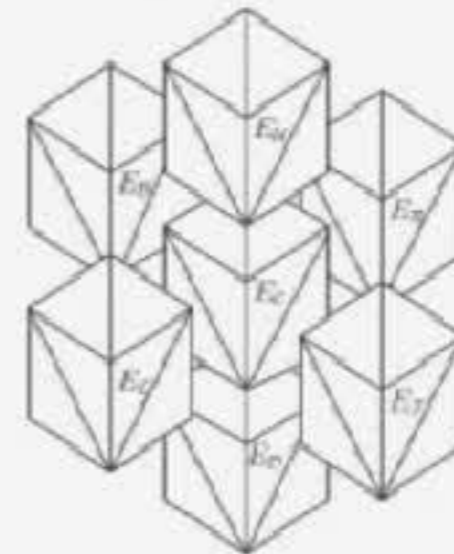
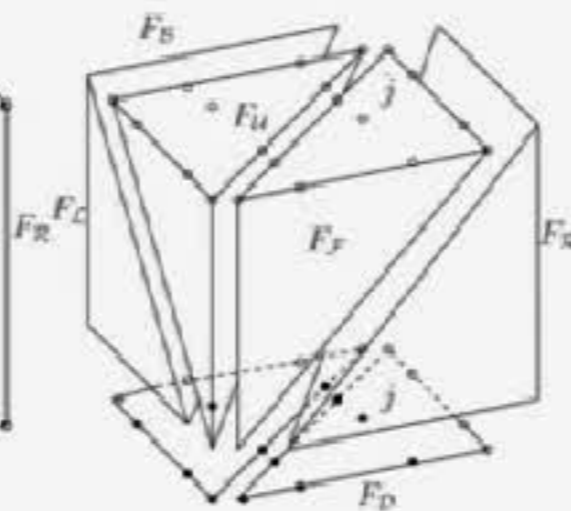
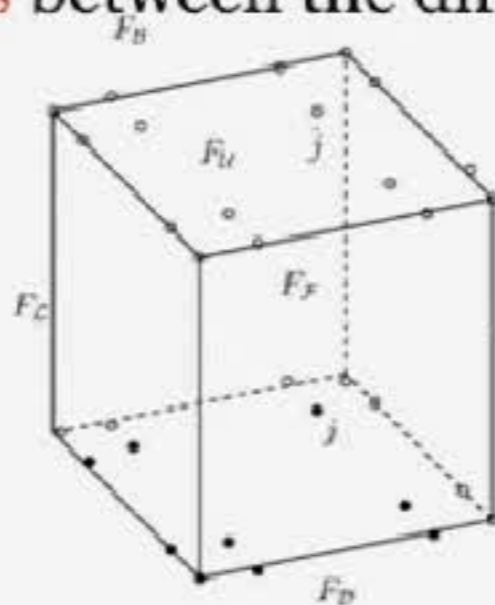
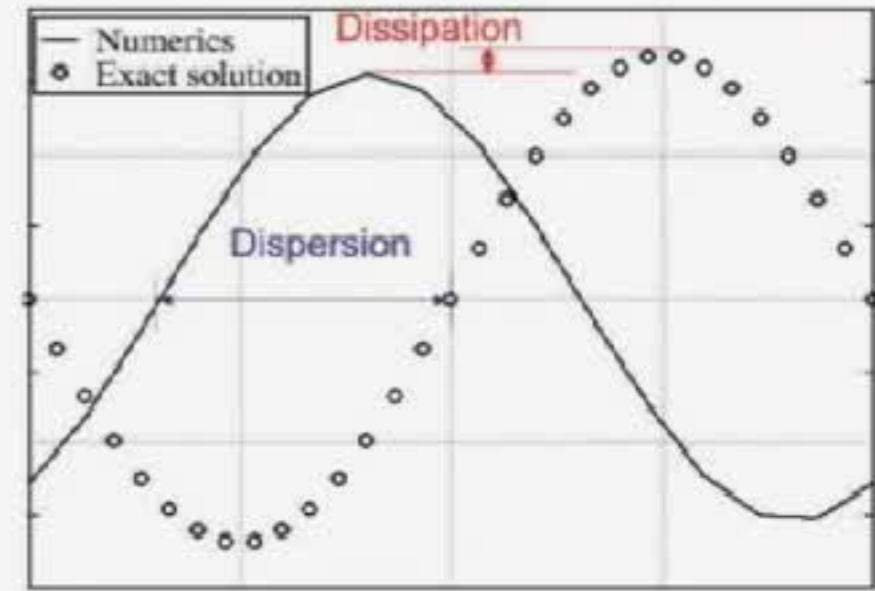
$\mathbf{A} = [A_1, A_2, A_3]^T$: the **amplitude** of the wave

ω : the **angular frequency**

$\mathbf{k} = 2\pi/L(\cos \theta \cos \phi, \sin \theta \cos \phi, \sin \phi)$ the **wavenumber vector**

L : **wavelength**

θ and ϕ : **angles** between the direction of propagation and the coordinate axes



Periodic tessellation based on employing hex/tet grids

[De Basabe et al., Geophys. J. Int. 2010], [Ainsworth et al, J. Sci. Comput. 2006] [Seriani et al. Wave Motion, 2008], [Ferroni, Antonietti, Mazzieri, Quarteroni, Geophys. J. Int. 2017]

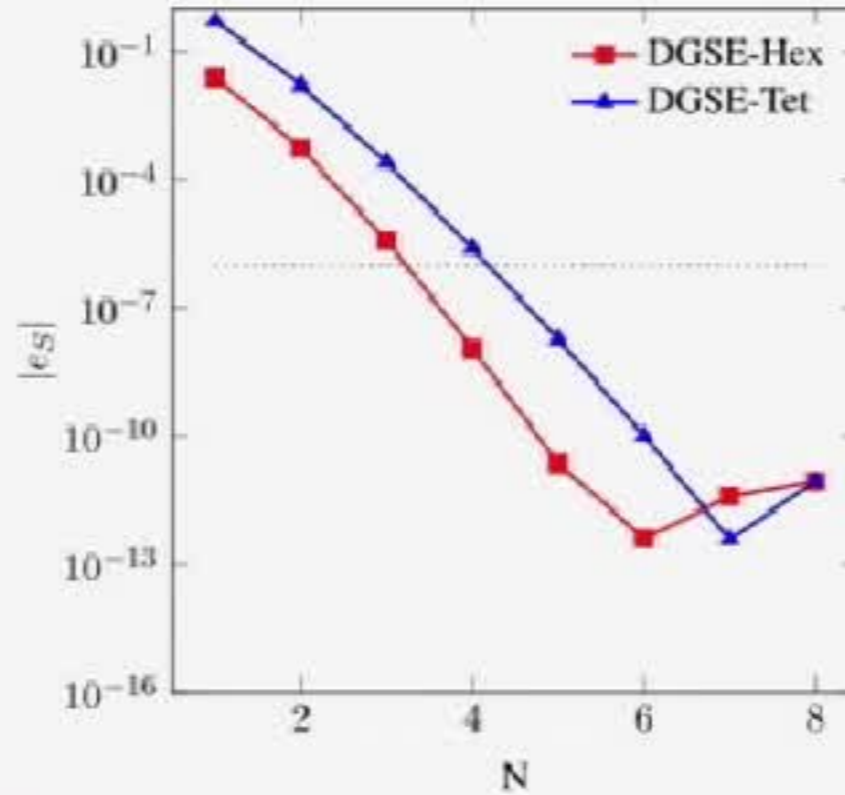
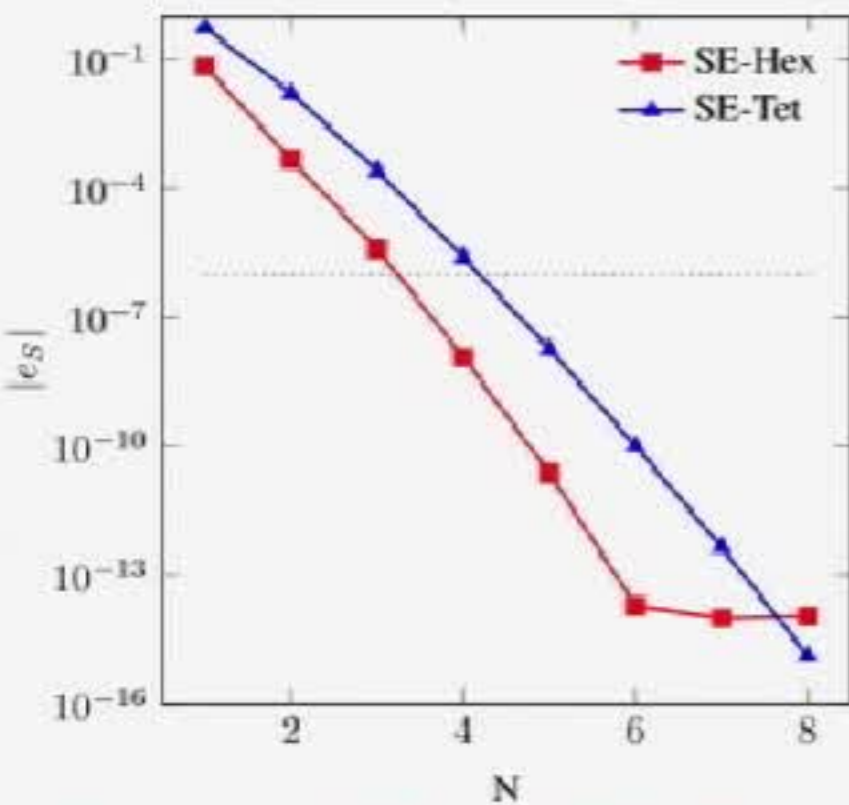
3D Grid dispersion analysis (cont'd)

Relative dispersion errors

$$e_S = \frac{c_{S,h}}{c_S} - 1.$$

$c_S = \sqrt{\mu/\rho}$ speed of shear waves

$c_{S,h}$ \longrightarrow numerical wave velocity



Computed dispersion errors $|e_S|$ versus N with

$\delta = 5$, $\theta = \phi = \pi/4$ and $r = 2$

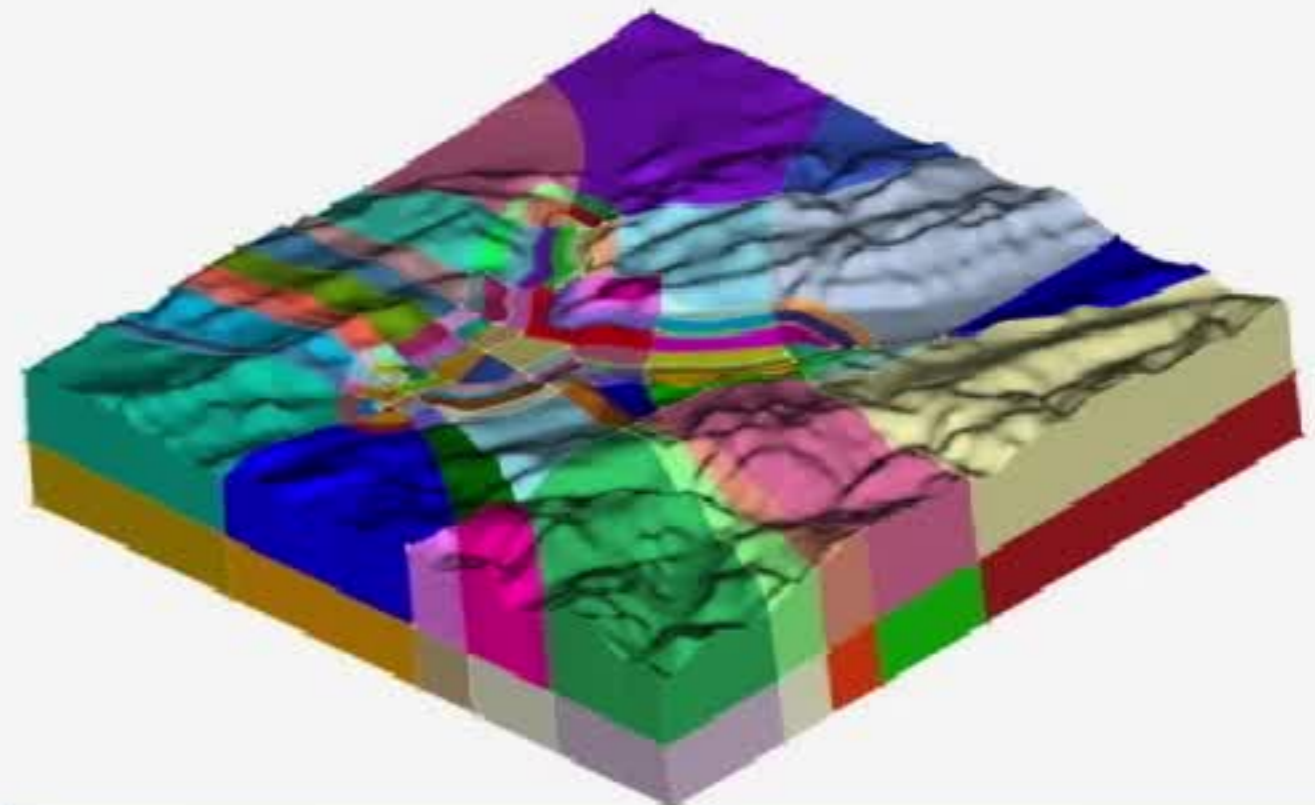
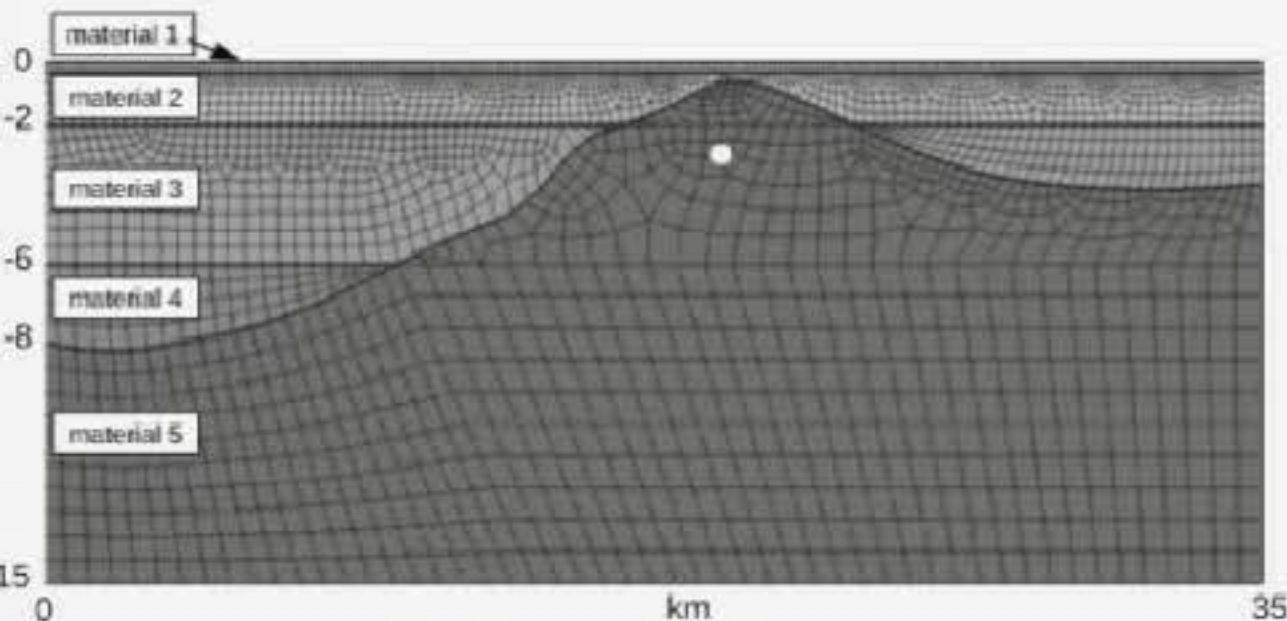
Dotted line = threshold value 10^{-6} .

- Exponential decay of the dispersion error with respect to the polynomial degree N
- SE feature slightly low dispersion error compared to DGSE
- For both SE and DGSE approximations
 - on hexahedral grids negligible dispersion errors (i.e. less than 10^{-6}) can be achieved using a polynomial approximation degree $N \geq 4$
 - on tetrahedral grids negligible dispersion errors can be achieved using a polynomial approximation degree $N \geq 5$

[Ferroni, Antonietti, Mazzieri, Quarteroni, Geophys. J. Int. 2017]

Lesson learnt

- As far as you can, use continuous (conforming) SEM
- To treat faults and material discontinuities, DGSEM offer a very valuable alternative to continuous SEM
- Tetrahedral DGSEM are definitely easier to implement than tetrahedral continuous SEM when dealing with complex geometries





Emilia (IT) earthquake
29.05.2012, M_w 6.0

Courtesy of G. Penna

Emilia earthquake, 29.05.2012, M_w 6.0



Emilia earthquake, 29.05.2012, M_w 6.0



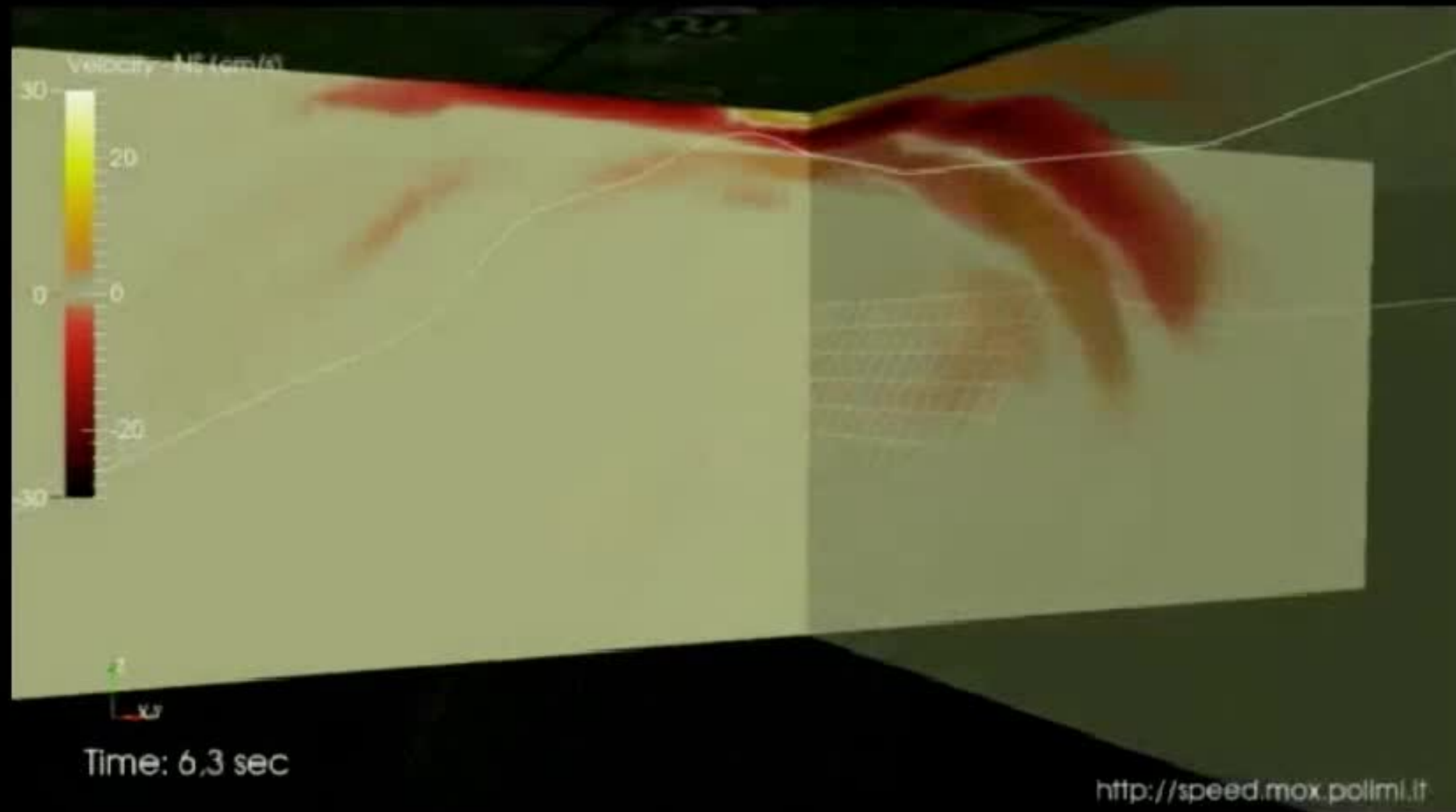
Emilia earthquake, 29.05.2012, M_w 6.0



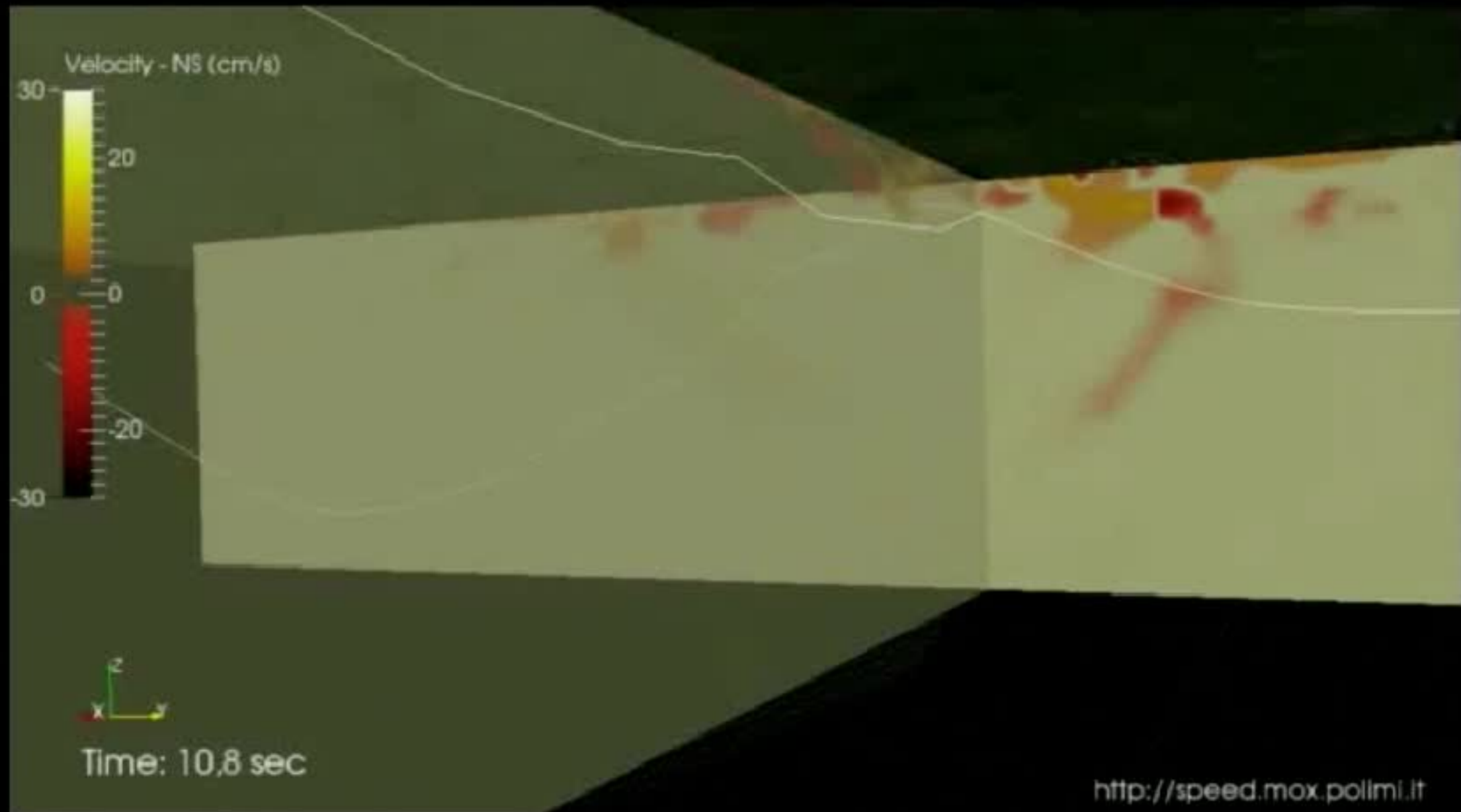
Emilia earthquake, 29.05.2012, M_w 6.0



Emilia earthquake, 29.05.2012, M_w 6.0

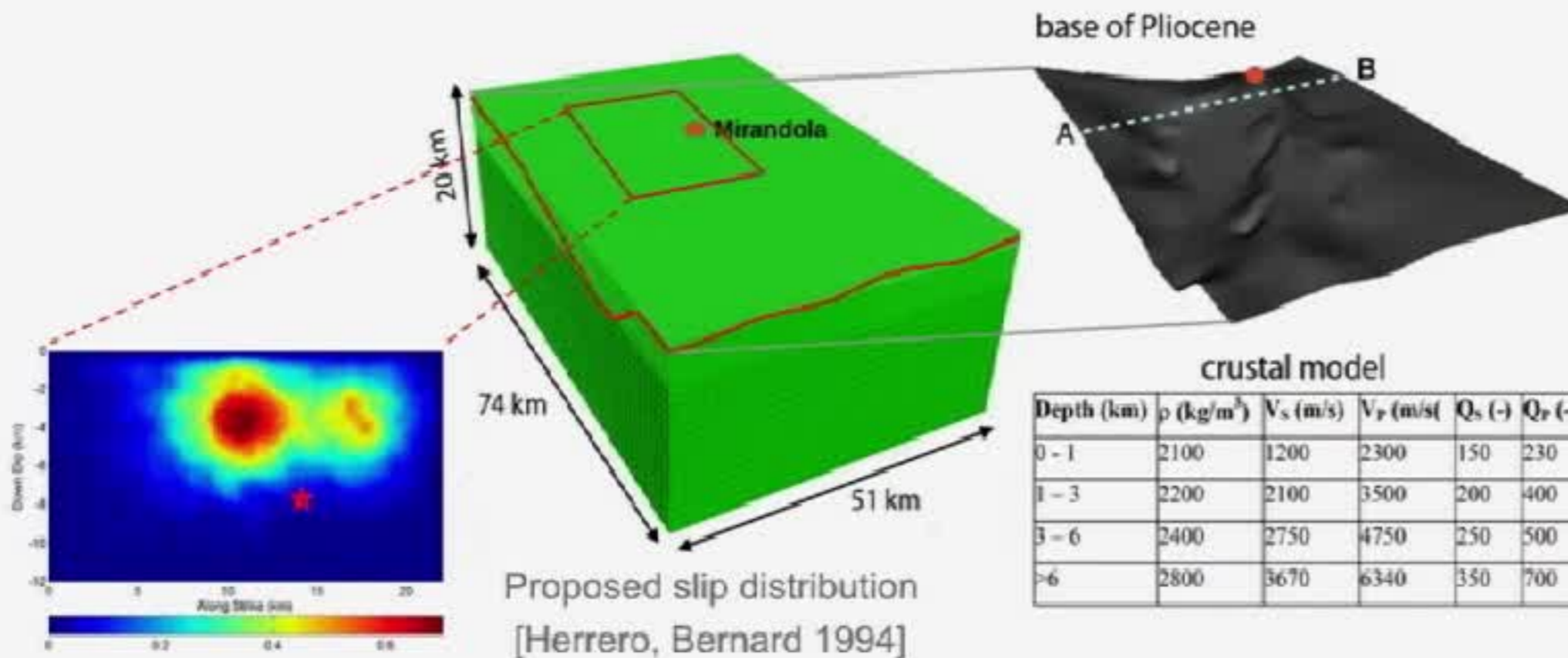
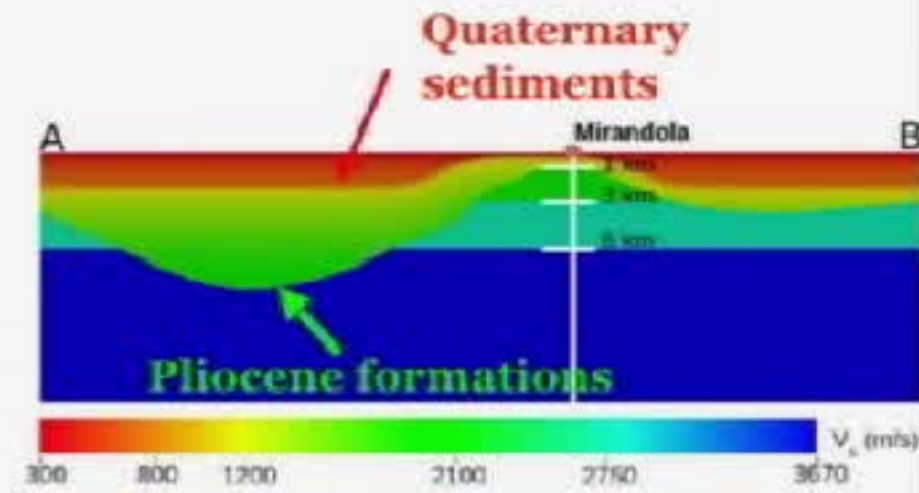


Emilia earthquake, 29.05.2012, M_w 6.0



Set-up of the 3D model

- Kinematic seismic source for the Mirandola fault
- 3D velocity model of the Po Plain (Plio-Quaternary sediments)
- Linear visco-elastic model
- $f_{\max} = 1.5$ Hz
- dofs ~ 150 million (polynomials of degree 3)
- $T_{\text{sim}} \sim 5$ hours on 4096 cores ([Fermi@Cineca](#) - ITALY)

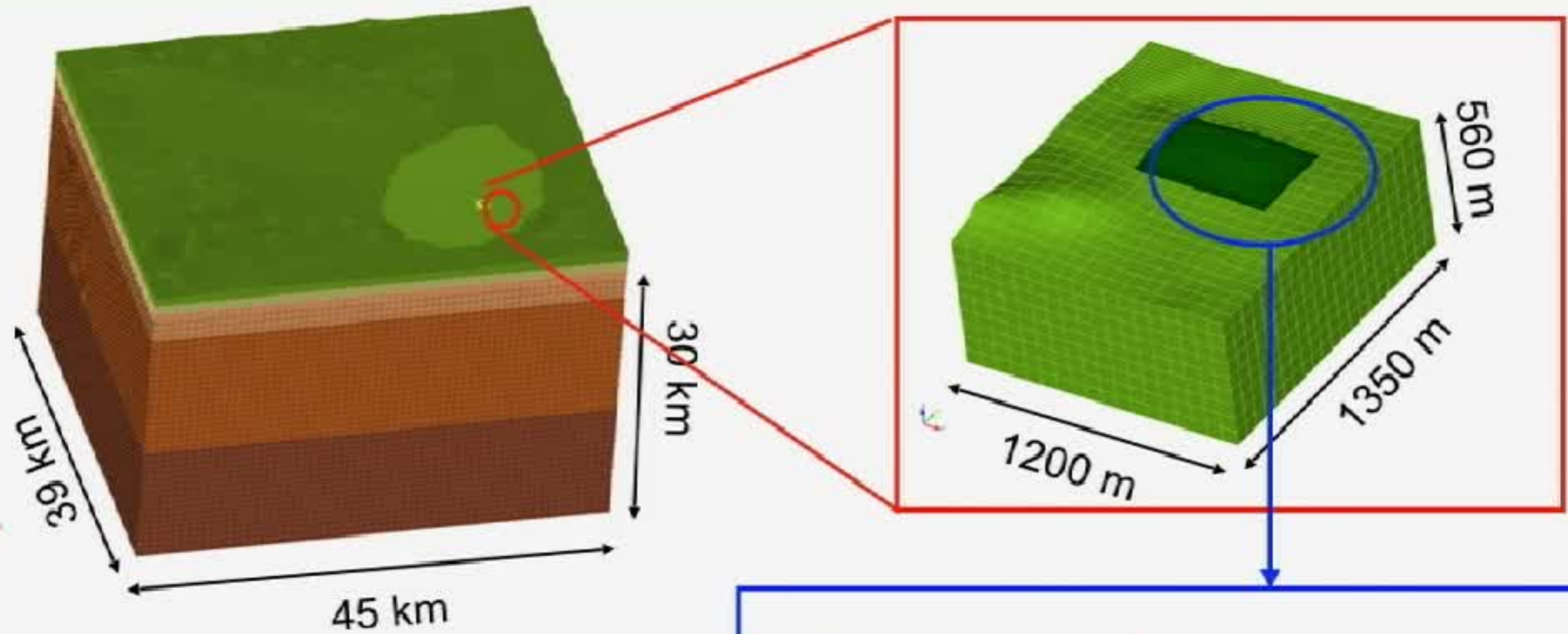


[Paolucci et al., JGI 2015]

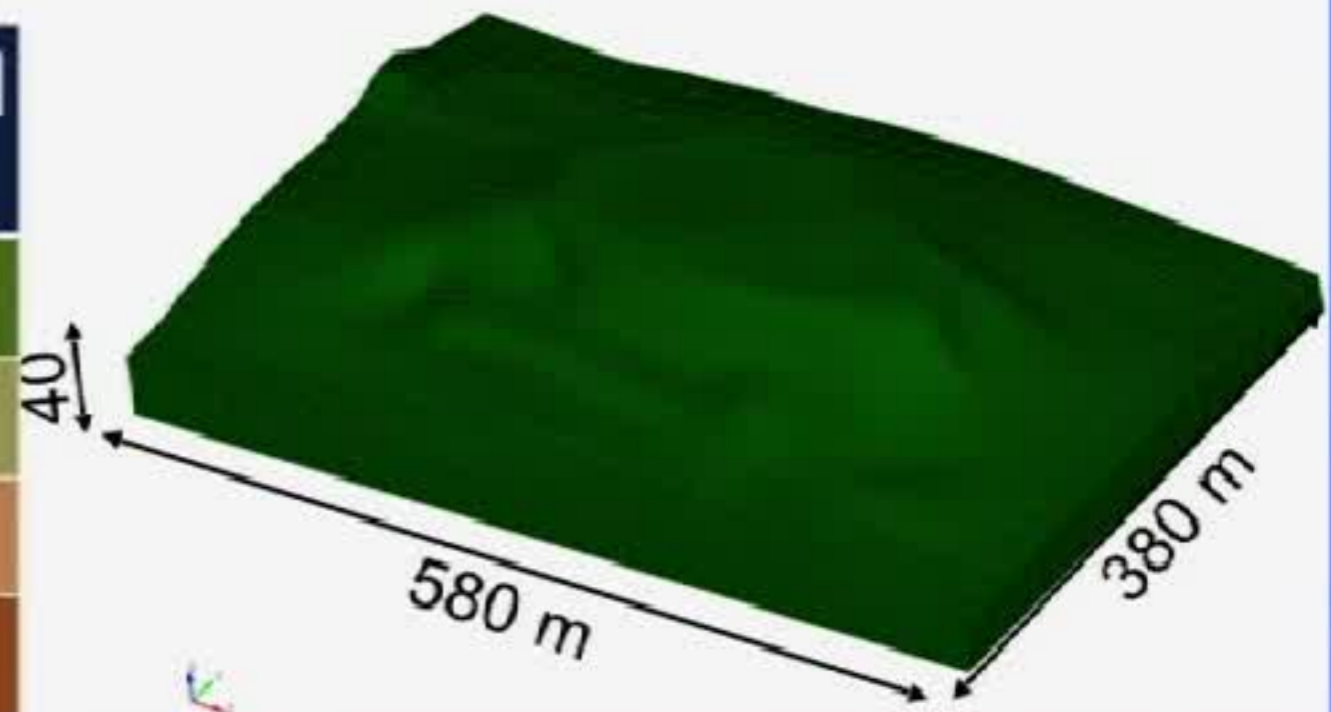


Athens earthquake
September 7, 1999, M_w 6.0

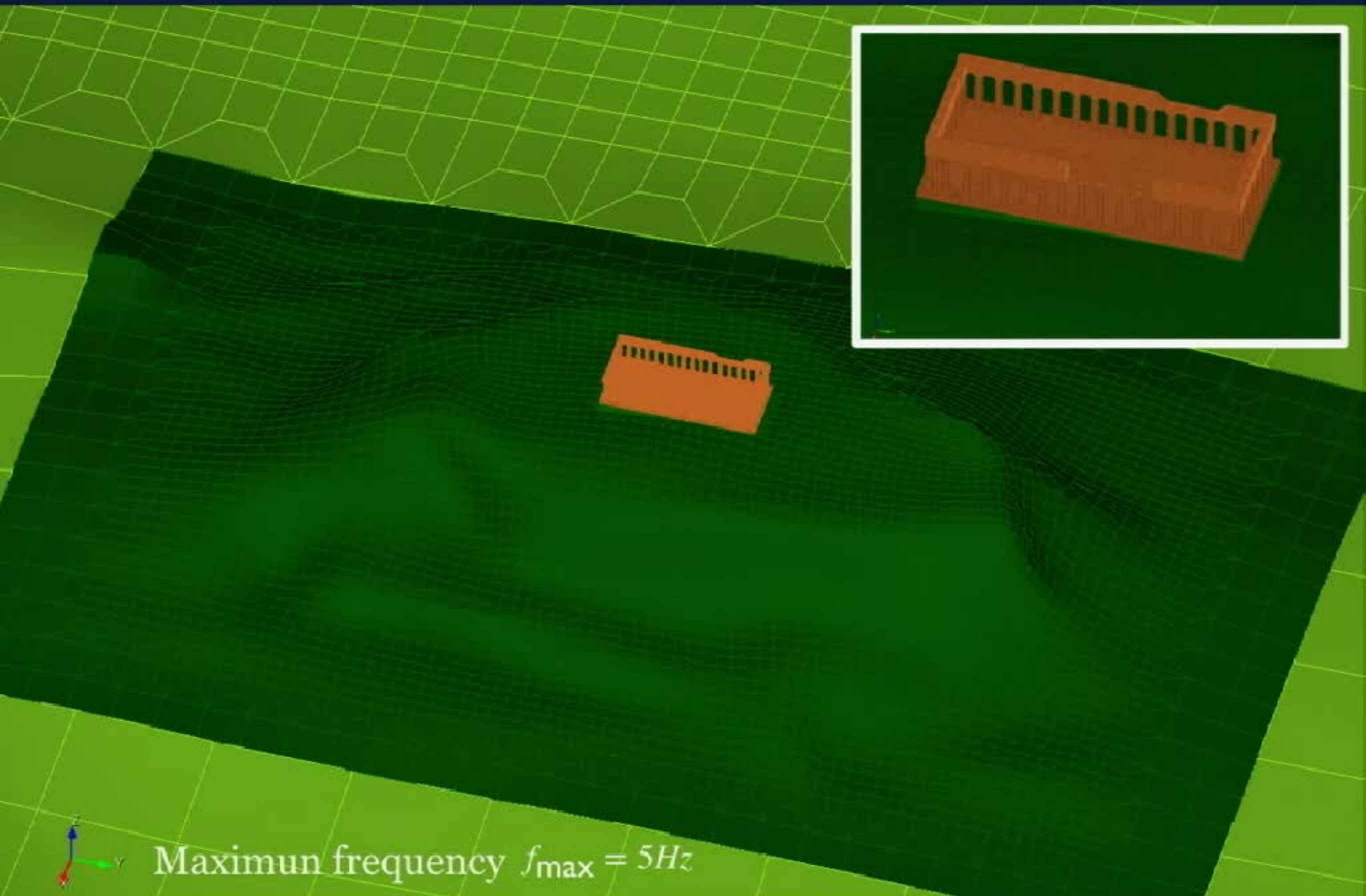
Athens, Acropolis, Parthenon: elevation and topography



Bottom Depth [km]	C_p [m/s]	C_s [m/s]	$[\text{g/cm}^3]$
Top - 1	2670	1500	2.50
1 - 2	4450	2500	2.50
2 - 5	5700	3200	2.84
5 - 18	6000	3370	2.90
18 - 30	6400	3600	2.98

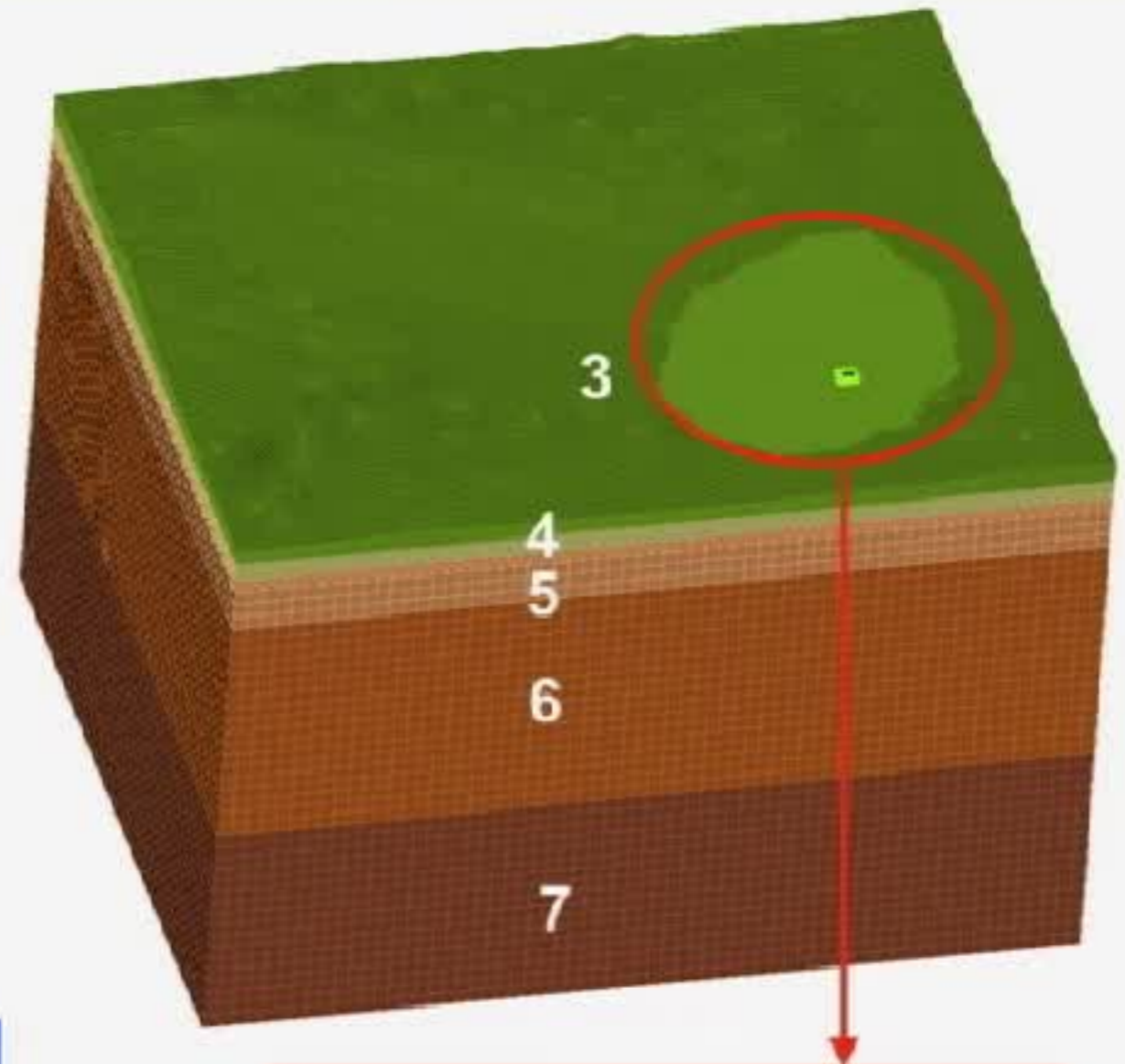


Computational grid: Parthenon and Acropolis



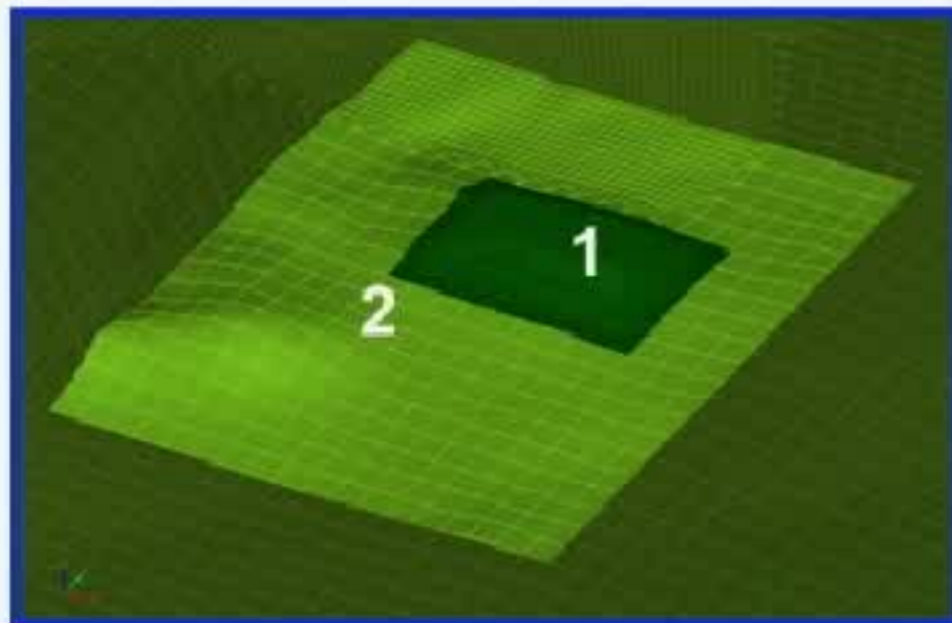
Computational model: mesh parameters

ID Block	N	h [m]
1	1	5 – 20
2	2	65
3	4	70 – 300
4	4	200 – 300
5	4	700
6	4	700
7	4	700

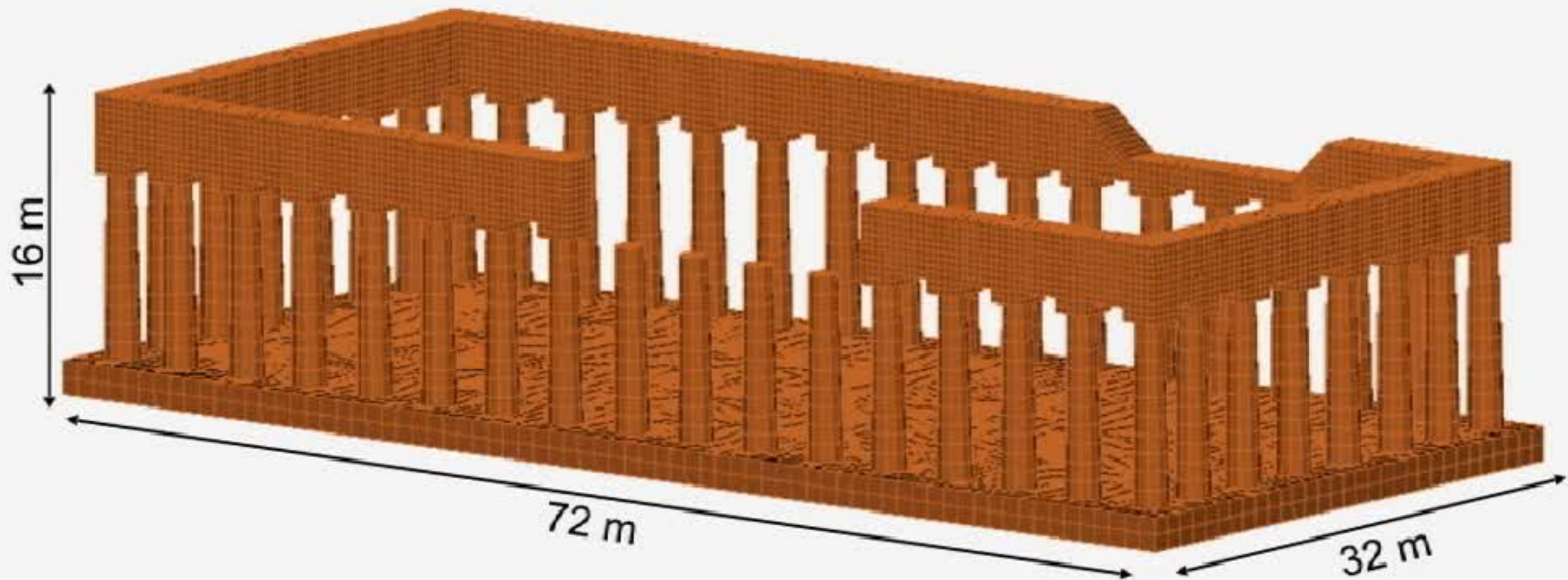


84 millions
DOFS

$$\Delta t = 10^{-4} s$$



Computational model: the Parthenon



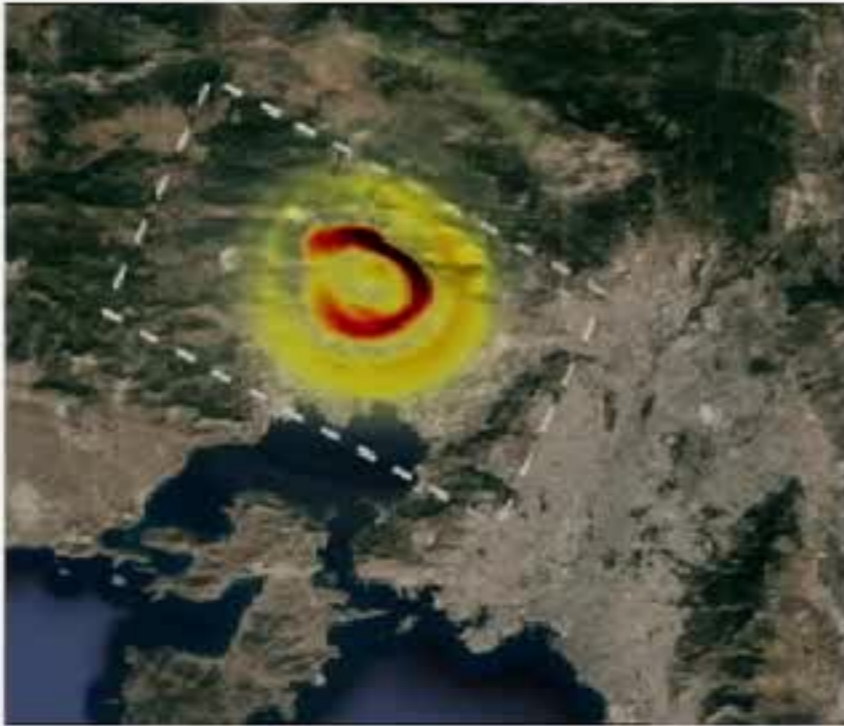
Material and mesh properties of the Parthenon

Material	C_p [m/s]	C_s [m/s]	ρ [g/cm ³]	N	h [m]
Porous marble	1000	600	2.50	1	0.5

[Egglezos, Ioannidou, Moullou, Kalogeras, Geotechnics and Heritage: Case Histories, 2013]

Velocity magnitude snapshots

$t = 4s$



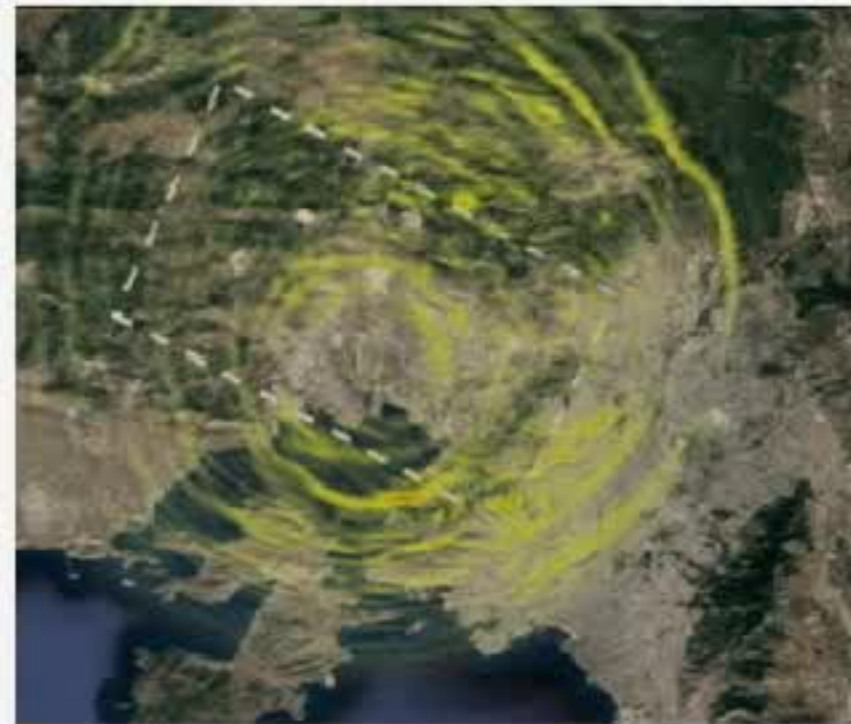
$t = 5s$



$t = 6s$



$t = 8s$



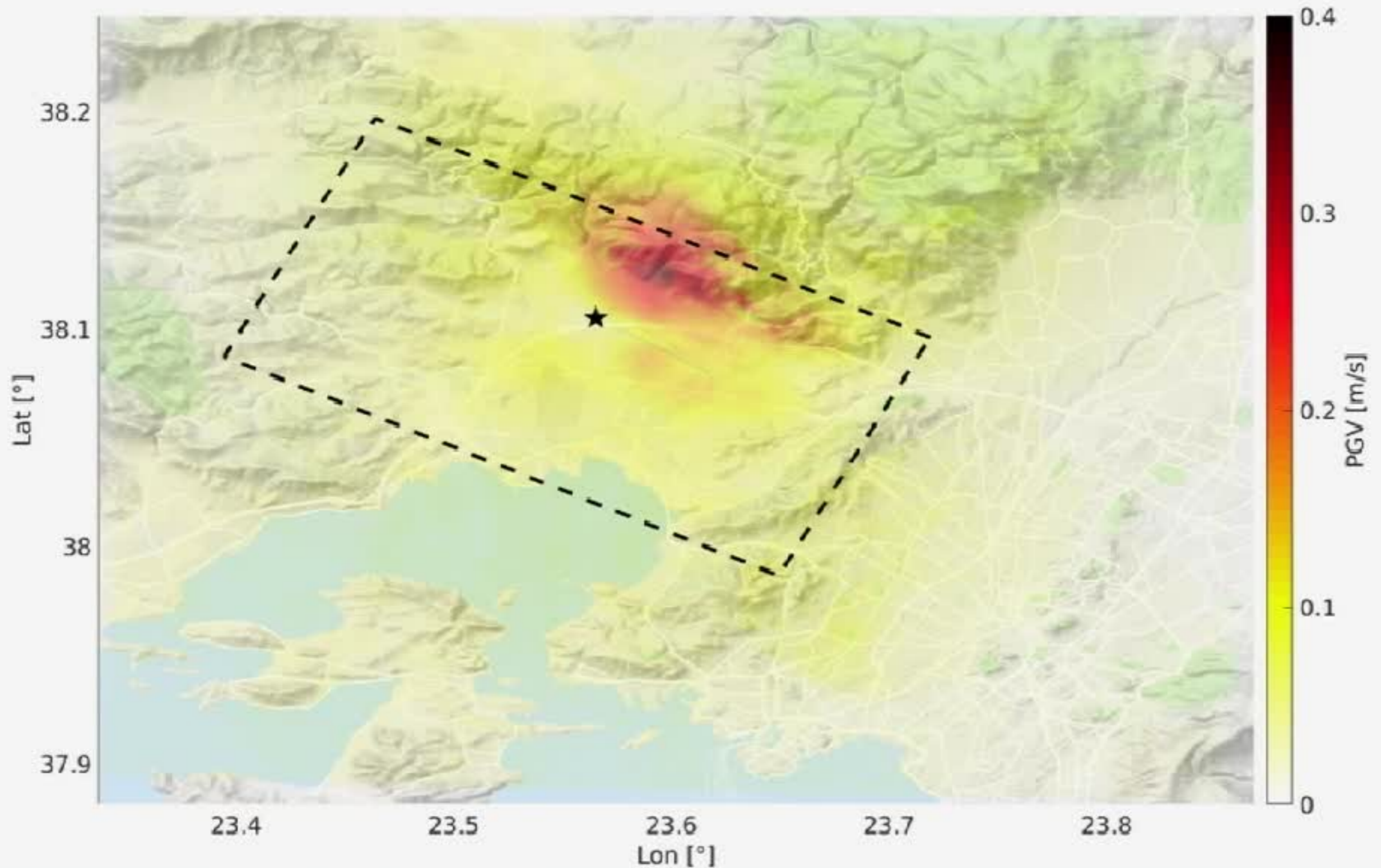
$|v|$ (m/s)

0.00 0.05 0.1 0.15 0.2 0.25



Peak-ground velocity map


$$PGV = \sqrt{\max_t |v_x(t)| \max_t |v_y(t)|}$$




M 5.9 Athens Earthquake 1999

2000x exaggeration





Synthetic ground motion scenarios:
Istanbul and the Marmara Sea region

The image is a composite. The top half shows a wide-angle, nighttime view of Istanbul, Turkey, with the city lights reflecting on the water of the Bosphorus Strait. A large bridge is visible in the middle ground. The bottom half shows a closer, high-angle view of a city street at night, with buildings and streetlights. A semi-transparent dark blue banner is overlaid across the middle, containing white text. In the top right corner, there is a small inset map of the Marmara Sea region with a red location pin.

Synthetic ground motion scenarios:
Istanbul and the Marmara Sea region

Computational model

Numerical model of Istanbul
(resolution: $f_{\max} = 1.5$ Hz)



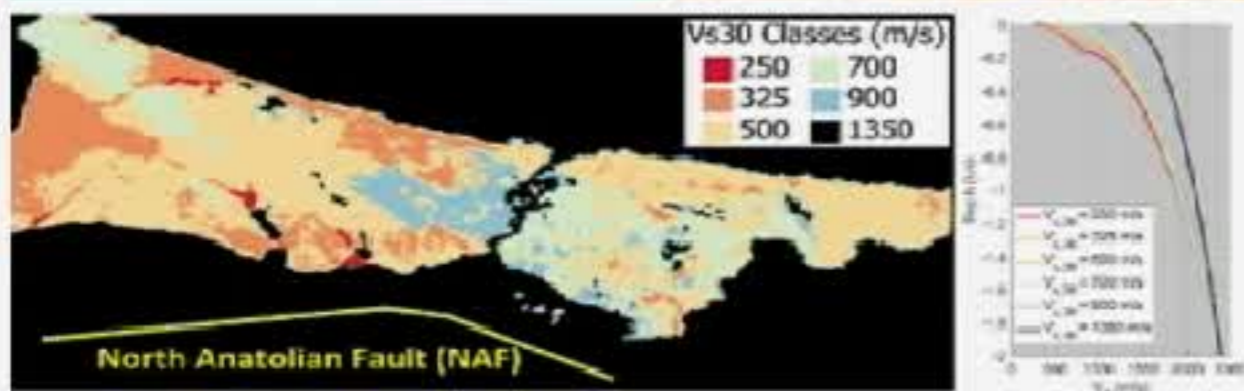
Horizontally stratified crustal model

Depth (km)	C_s [m/s]	Q
0-5	Fig. 3	$V_s/10$
5-10	3490	350
10-20	3500	350
20-30	3920	400

$$Q \approx \frac{1}{\zeta}$$

Computational model

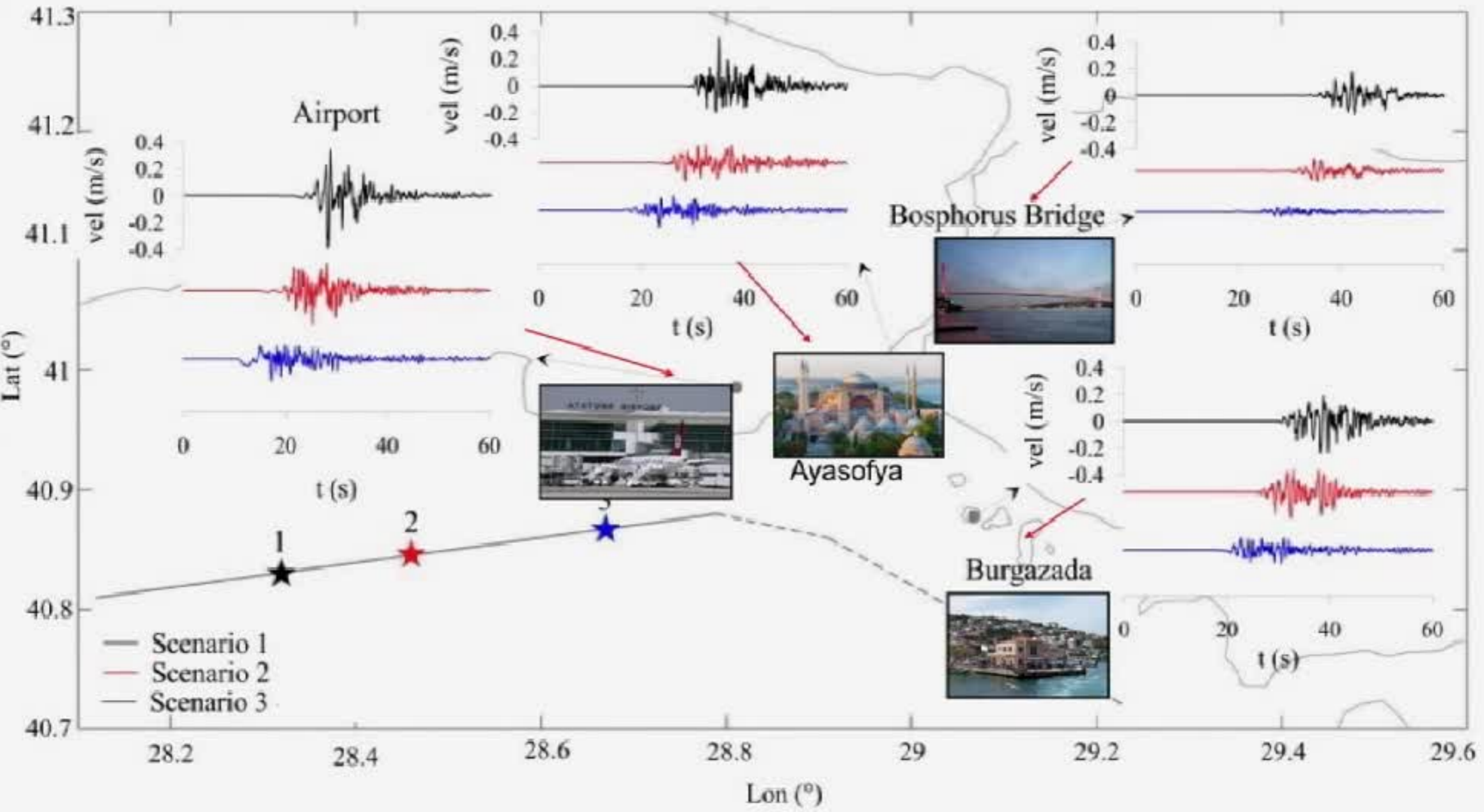
Hexahedral elements	2.257.482
Degrees of freedom	~500 million
Frequency range	0 to 1.5 Hz
Element size range	180 m to 2 km



■ Digital elevation model and map of classes of $V_{s,30}$ implemented in SPEED

Computed velocity fields for different scenarios

Velocity for different scenarios





Time: 0,0 s

M 7.0



Time: 0,0 s

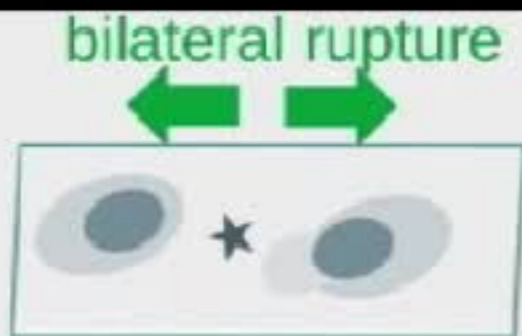
M 7.0



Time: 0,0 s

M 7.0

FO=fault orthogonal



Computational model

Numerical model of Istanbul
(resolution: $f_{\max} = 1.5$ Hz)



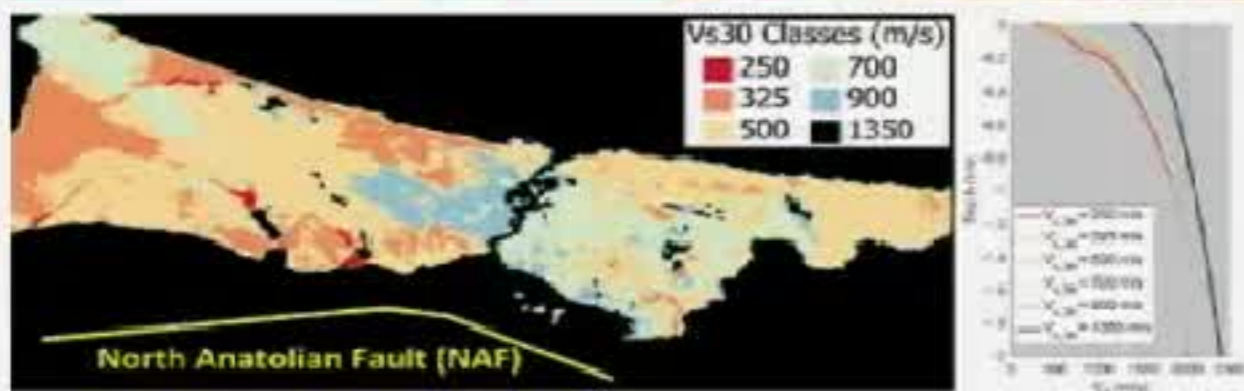
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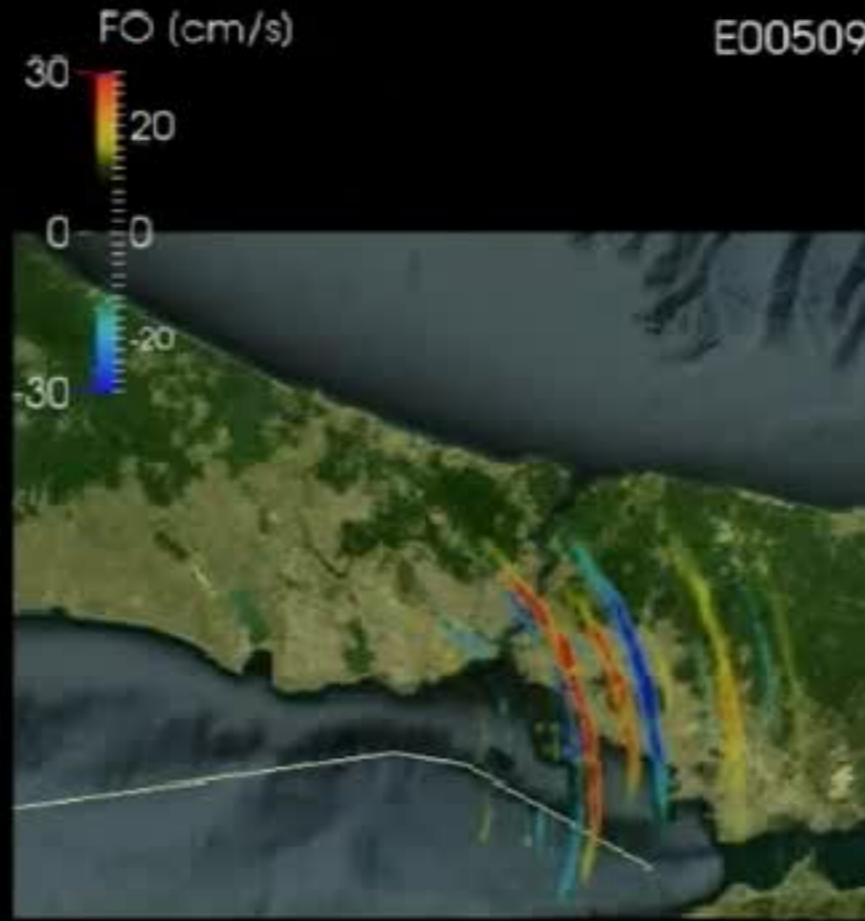


■ Digital elevation model and map of classes of $V_{s,30}$ implemented in SPEED



Time: 32,2 s

M 7.0



Time: 32,2 s

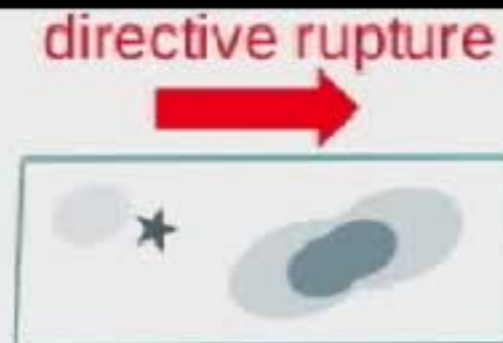
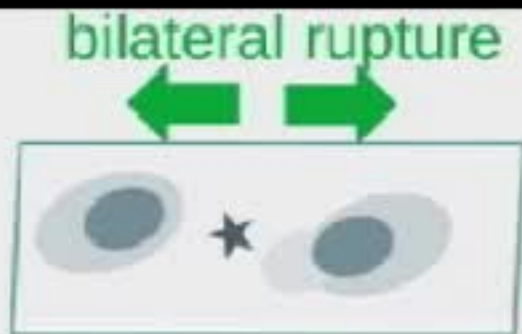
M 7.0



Time: 32,2 s

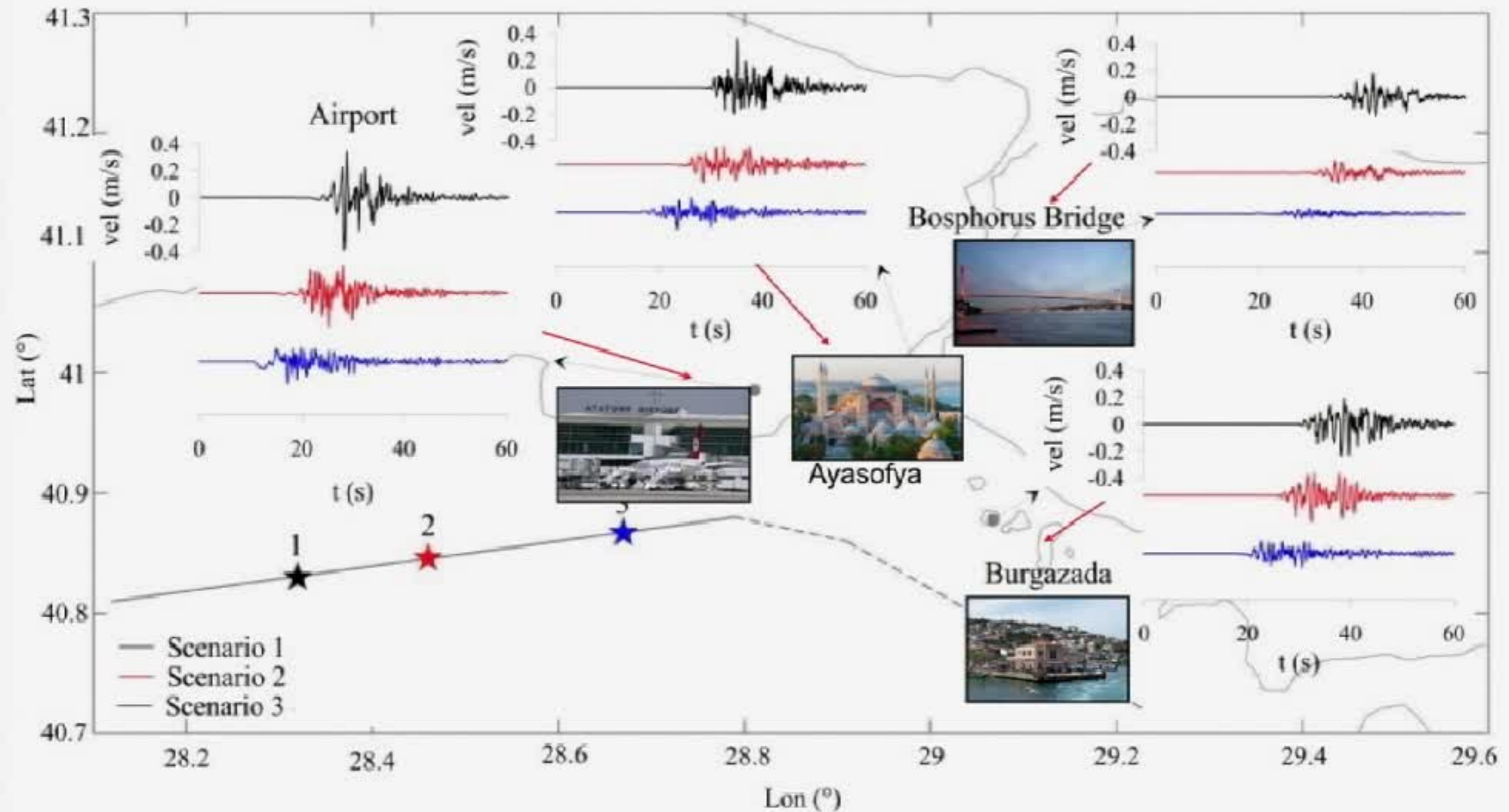
M 7.0

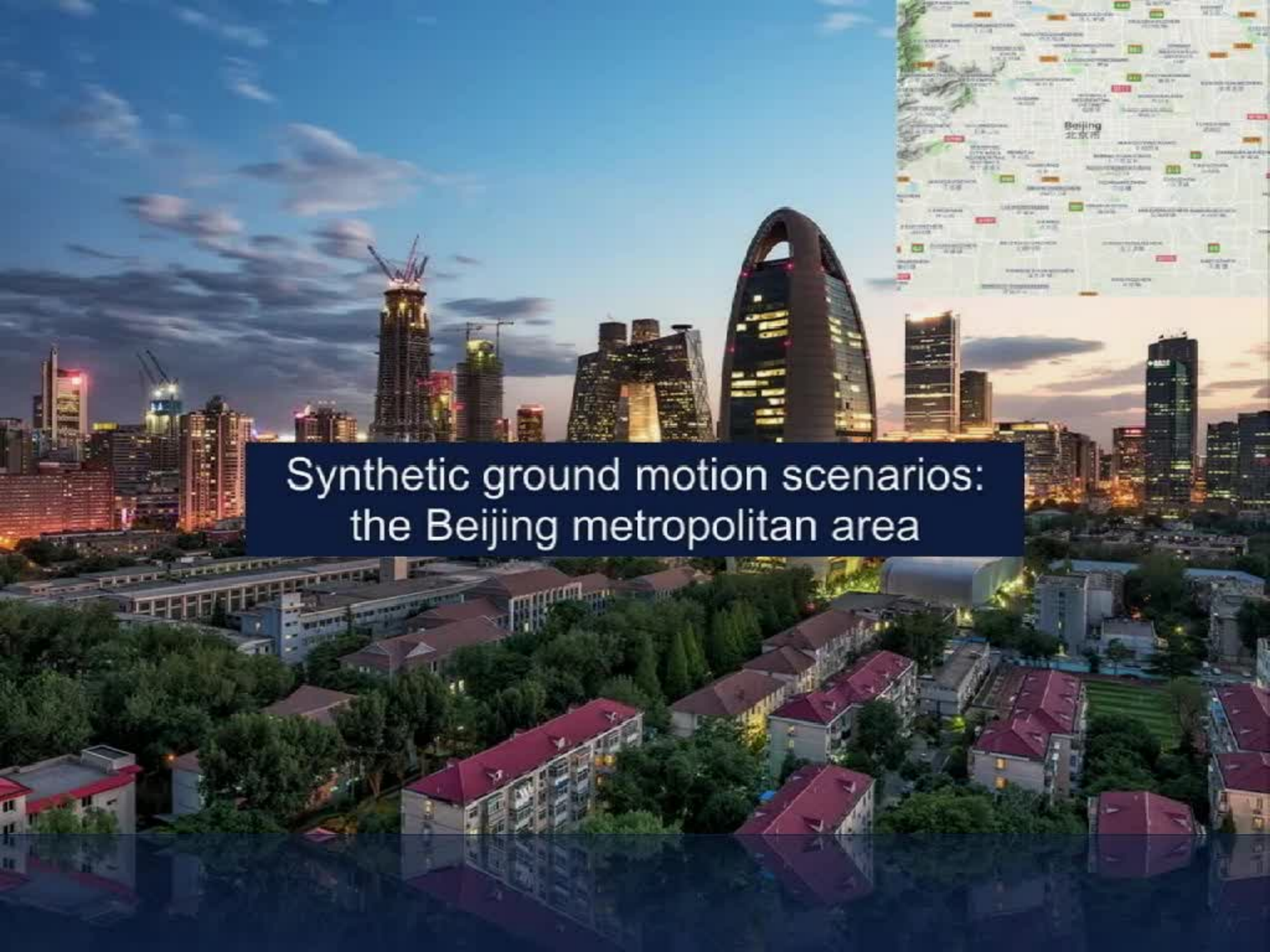
FO=fault orthogonal



Computed velocity fields for different scenarios

Velocity for different scenarios





Synthetic ground motion scenarios:
the Beijing metropolitan area

3D physics-based numerical modelling of Beijing



Beijing metropolitan area

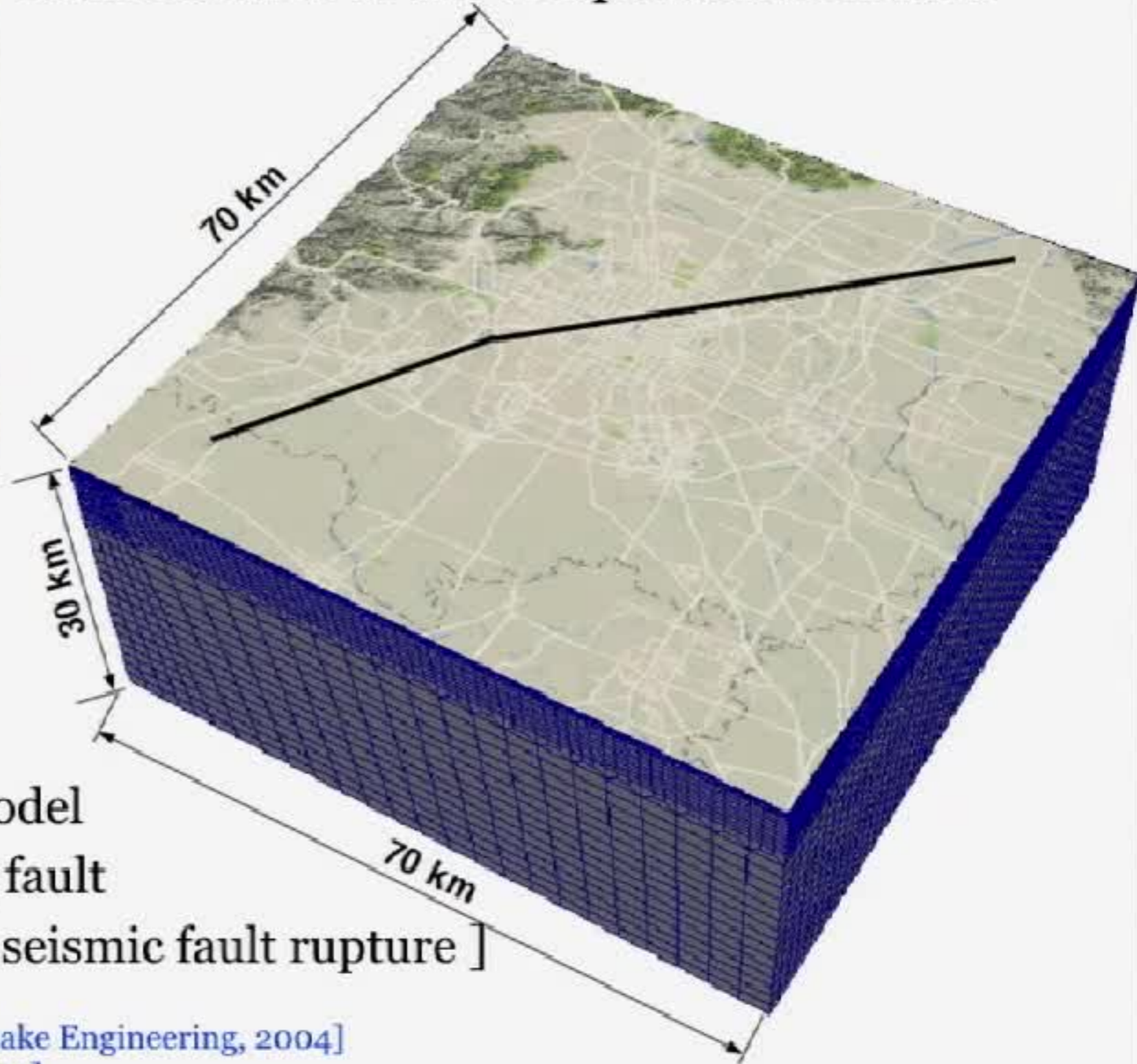
Land: 16.801 km²

Population: 21.707.000

Density: 1.300/km²

- Topography and 3D basin model
- Shunyi-Qianmen-Liangxiang fault
- Kinematic description of the seismic fault rupture]

Main features of the computational model

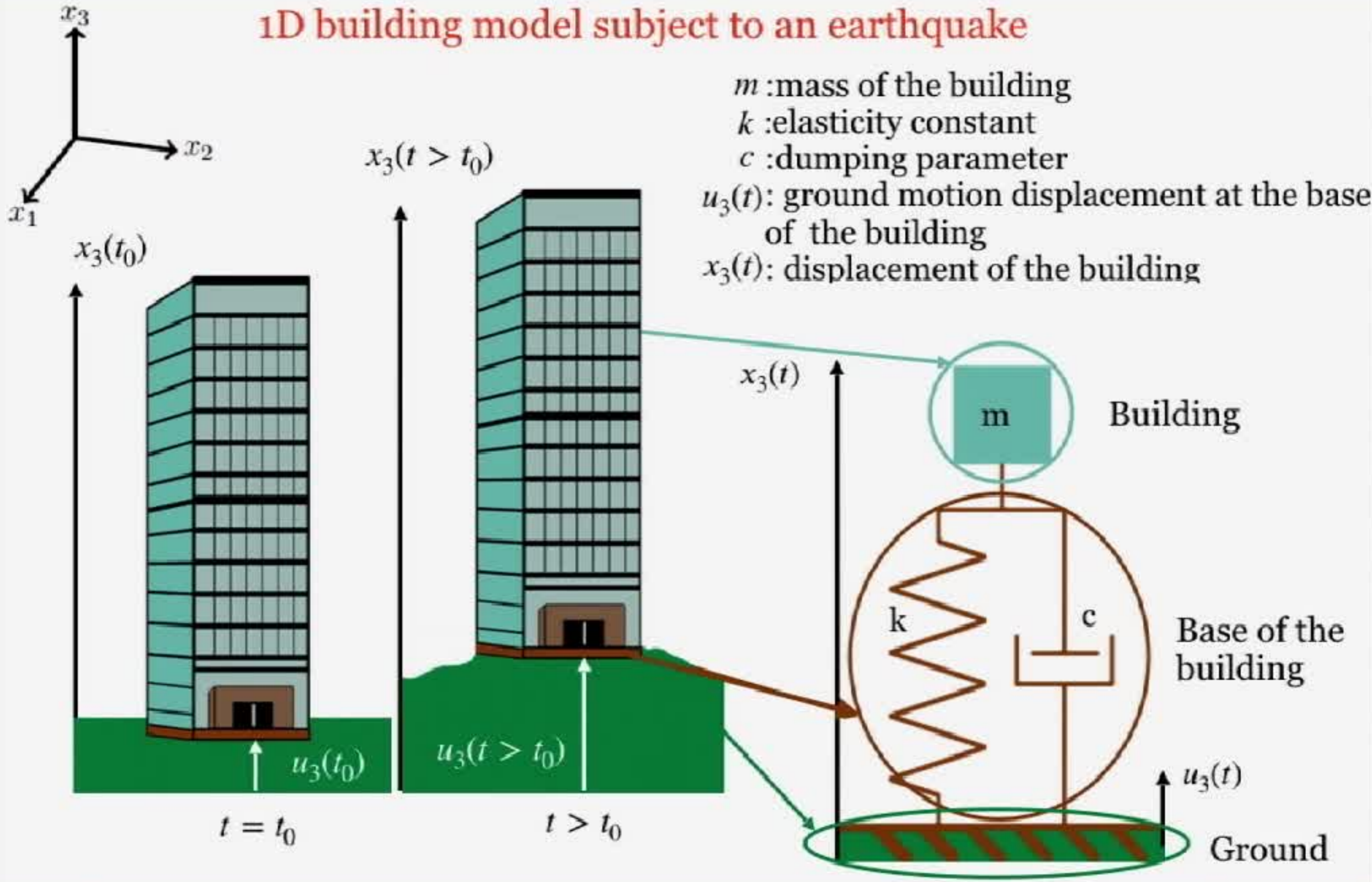


[Gao, Yu, Zhang, Wu, Conference on Earthquake Engineering, 2004]

[Crempien, Archuleta, Seismol. Res. Lett., 2015]

Ground motion parameters: spectral displacement

1D building model subject to an earthquake



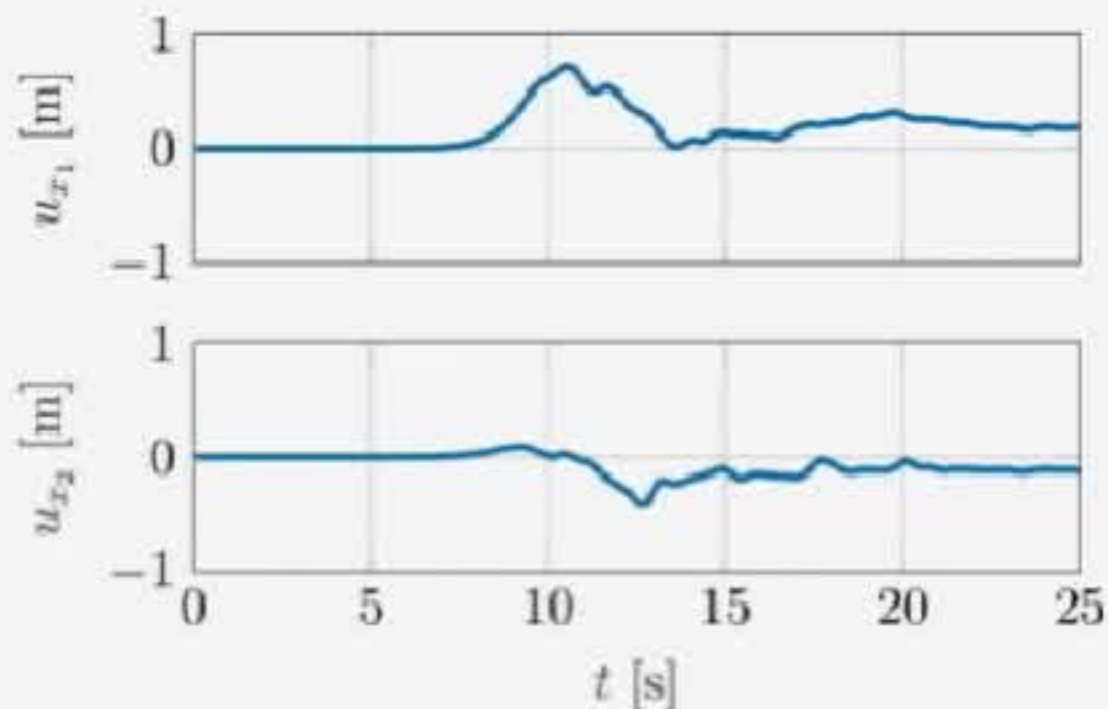
From SPEED to ground motion parameters

SD is the maximum relative displacement response of the building w.r.t. the ground

Spectral displacement (horizontal geometric mean) is a measure of the intensity of the earthquake and it is defined as

$$SD(\mathbf{x}; T, \xi) = \sqrt{SD(x_1; T, \xi)SD(x_2; T, \xi)},$$

where $SD(x_1; T, \xi)$, $SD(x_2; T, \xi)$ are the spectral displacement computed w.r.t. x_1 and x_2 direction, respectively.



Input for damped vibrating system:

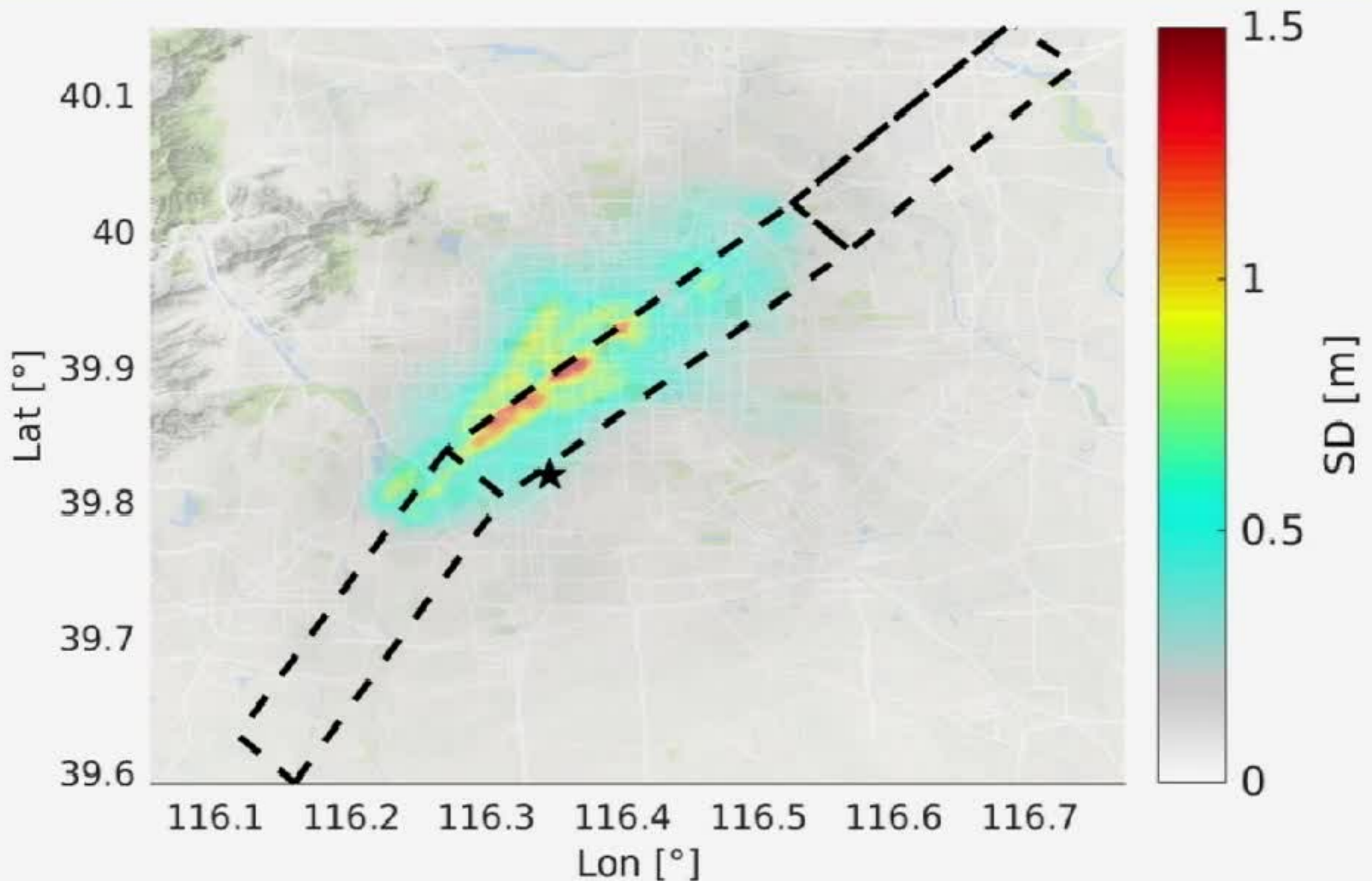
- $\mathbf{u}(t)$, $\ddot{\mathbf{u}}(t)$ computed displacement and acceleration in x_1, x_2 directions (by SPEED)
- T, ξ period and damping ratio (user-defined)

Output from damped vibrating system:

$\mathbf{x}(t)$ displacement in x_1, x_2 directions of a damped vibrating system, e.g. buildings.

Objective: compute $SD(\mathbf{x}; T, \xi)$

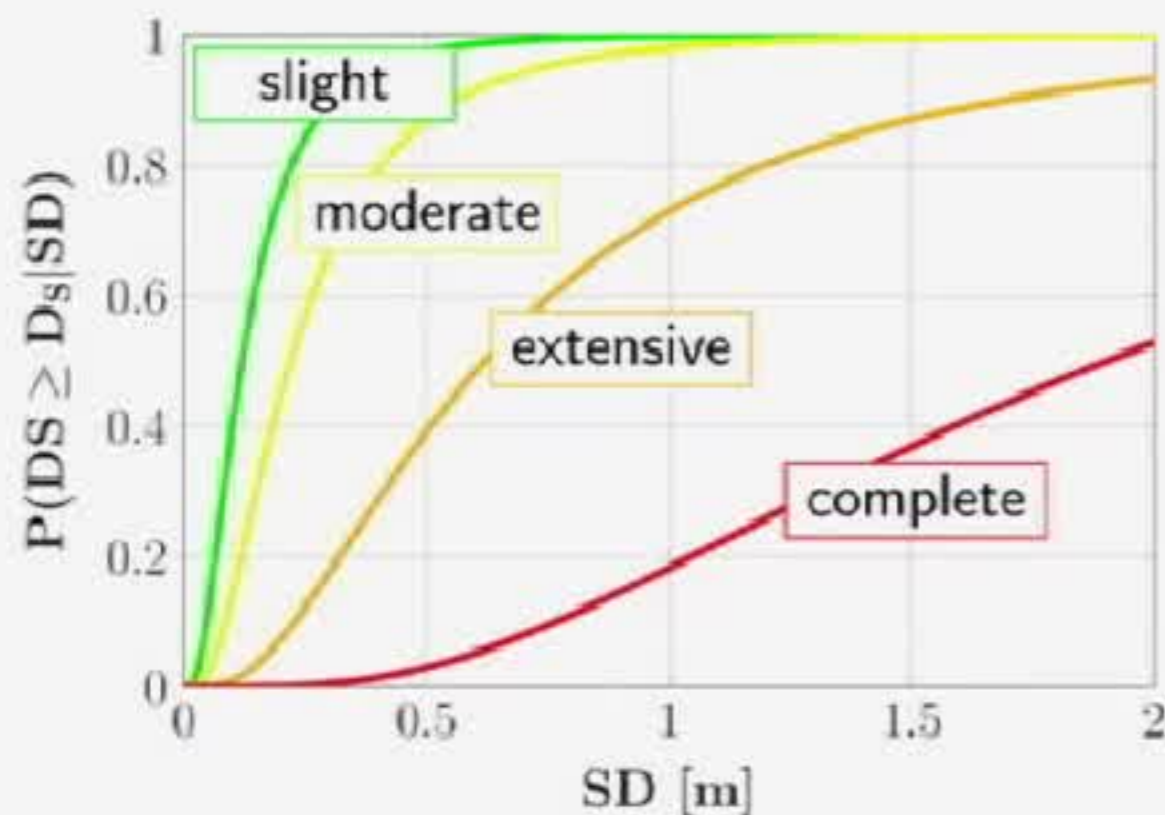
From SPEED to ground motion parameters



Spectral displacement (SD) map for $T = 3s, \xi = 0.05$

Seismic fragility curves model

Seismic fragility curves: represent the conditional probability of failure of constructions, e.g. buildings or bridges, for a given seismic response parameter, e.g. spectral displacement, peak ground acceleration, ...



Profiles of fragility curves, i.e.,

$$P(DS \geq D_s | SD)$$

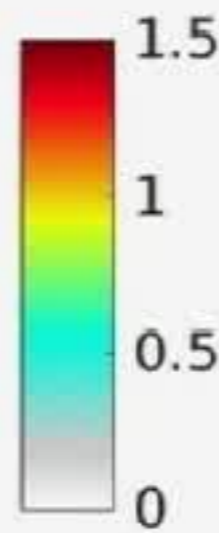
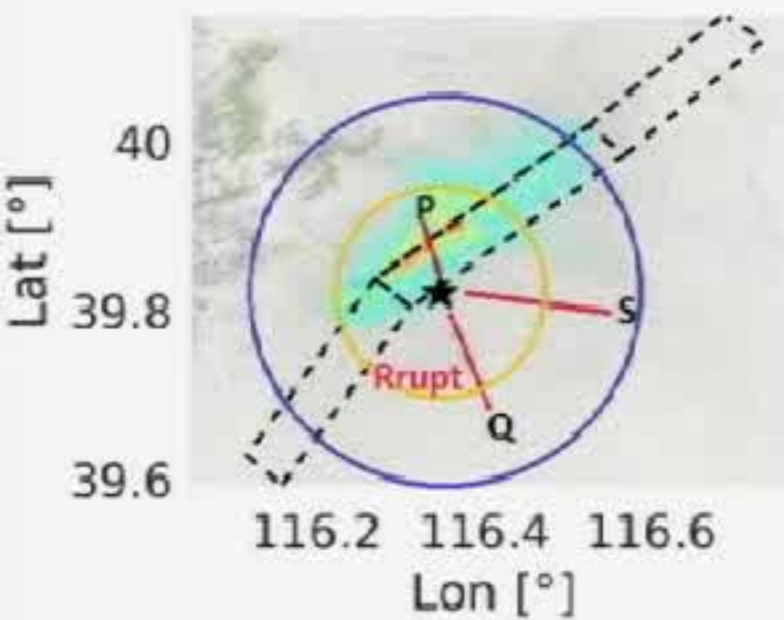
versus SD , for Chinese high-rise buildings. Each color denotes the type of damage state D_s .

Fragility curves for constructions are calibrated on their characteristics. E.g. for buildings: period of construction, material, storey numbers, ...

- DS = damage state variable: measures the damages of a construction in a qualitative way.
- D_s = type of damage state (slight, moderate, extensive, complete)
- SD = spectral displacement

[Wu, Wang, Yang, Appl. Mech. Mater., 2013]

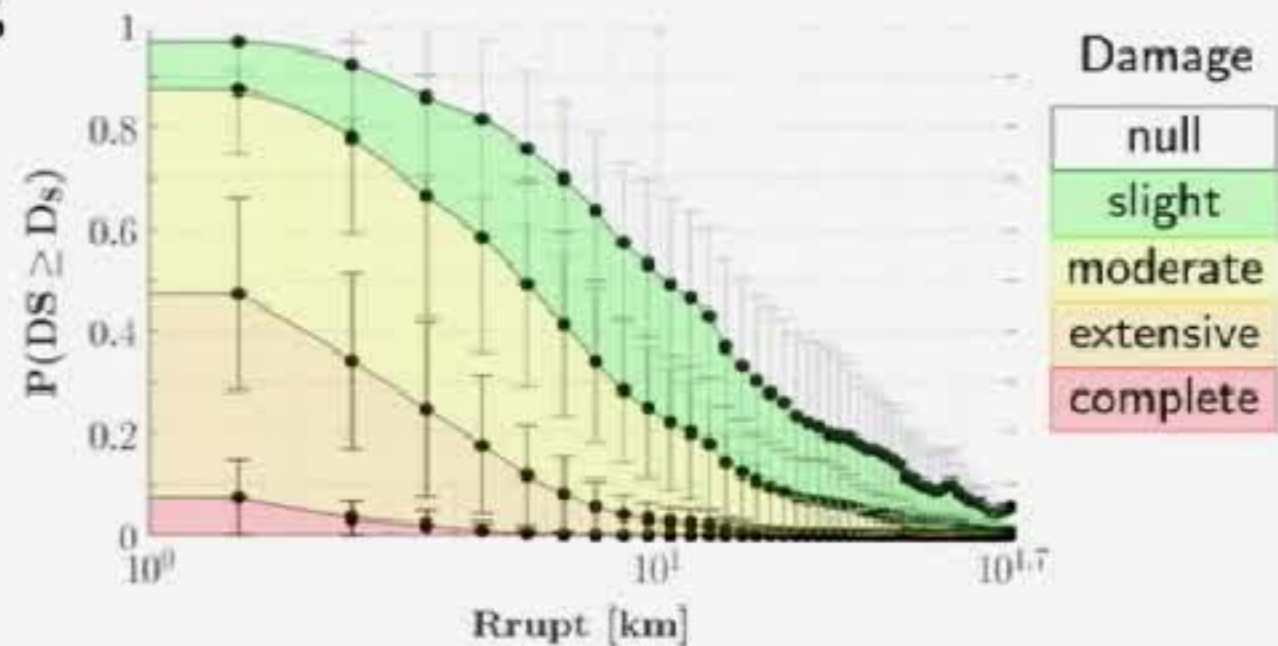
Seismic risk analysis for high-rise buildings (100 - 200 m tall)



1. From the points P , S , Q with coordinates (Lon, Lat) compute the **distances to the fault rupture area (R_{rupt})**;
2. $SD(Lon, Lat) \longrightarrow SD(R_{rupt})$;
3. Subdivision of points P , S , Q in groups w.r.t. R_{rupt} .

Fragility curves

- **Colors** denote the probability of reaching a selected damage state, i.e., $P(DS = D_s)$, versus R_{rupt} .
- **Black dots** represent the mean of the probability of exceeding different damage states, i.e., $P(DS \geq D_s)$ versus R_{rupt} ,
- **Black bars** represent the corresponding standard deviation.



[Mazzieri, Melas, Smerzini, Stupazzini. Proceedings of the 16th European Conference on Earthquake Engineering. 2018]
 [Antonietti, Mazzieri, Melas, Paolucci, Quarteroni, Smerzini, Stupazzini, in prep, 2019]

Christchurch Earthquake February 22, 2011



Christchurch earthquake Mw 6.3

22 February 2011 at 12:51 p.m.



Dipartimento di **Ingegneria
Civile e Ambientale**

Christchurch Earthquake February 22, 2011



Christchurch earthquake Mw 6.3

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SPEED



Christchurch Earthquake February 22, 2011



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