

Toward Data Lakes for Recorded and Simulated Earthquake Ground Motions

2 - 4 September 2024, GFZ Potsdam



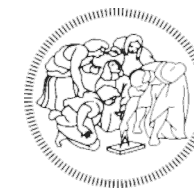
Orfeus



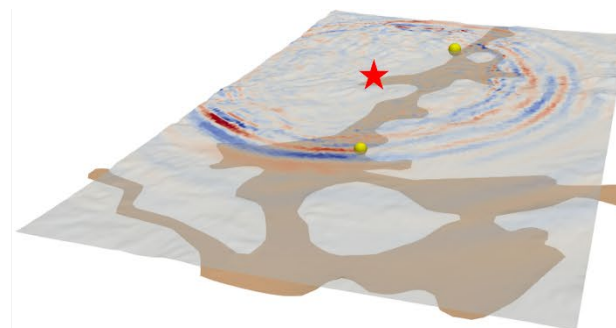
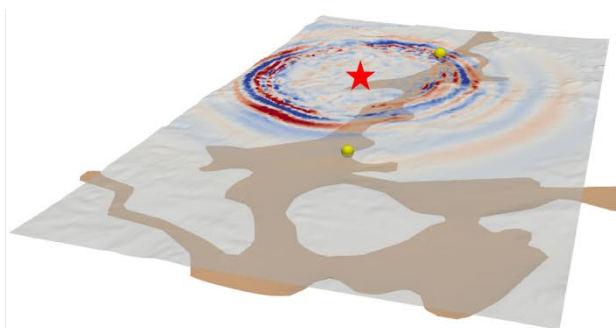
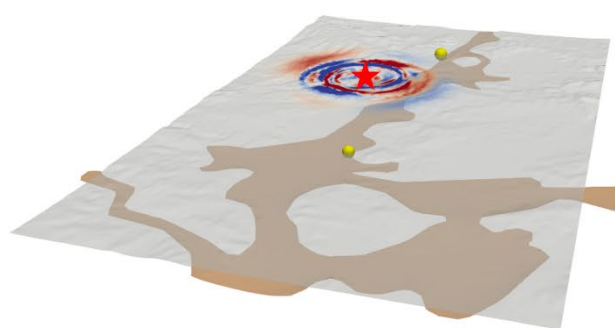
Applications and challenges of 3D physics-based numerical simulations in engineering seismology

Chiara Smerzini

Politecnico di Milano, Italy



POLITECNICO
MILANO 1863



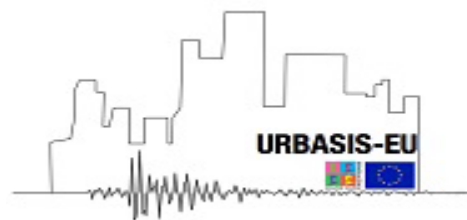
SPEED



Thanks to

...and the SPEED team!

swissnuclear



Munich RE 



A. Quarteroni



P. Antonietti



I. Mazzieri



R. Paolucci



M. Stupazzini



M. Vanini



S. Sangaraju



V. Hernandez



J. Lin

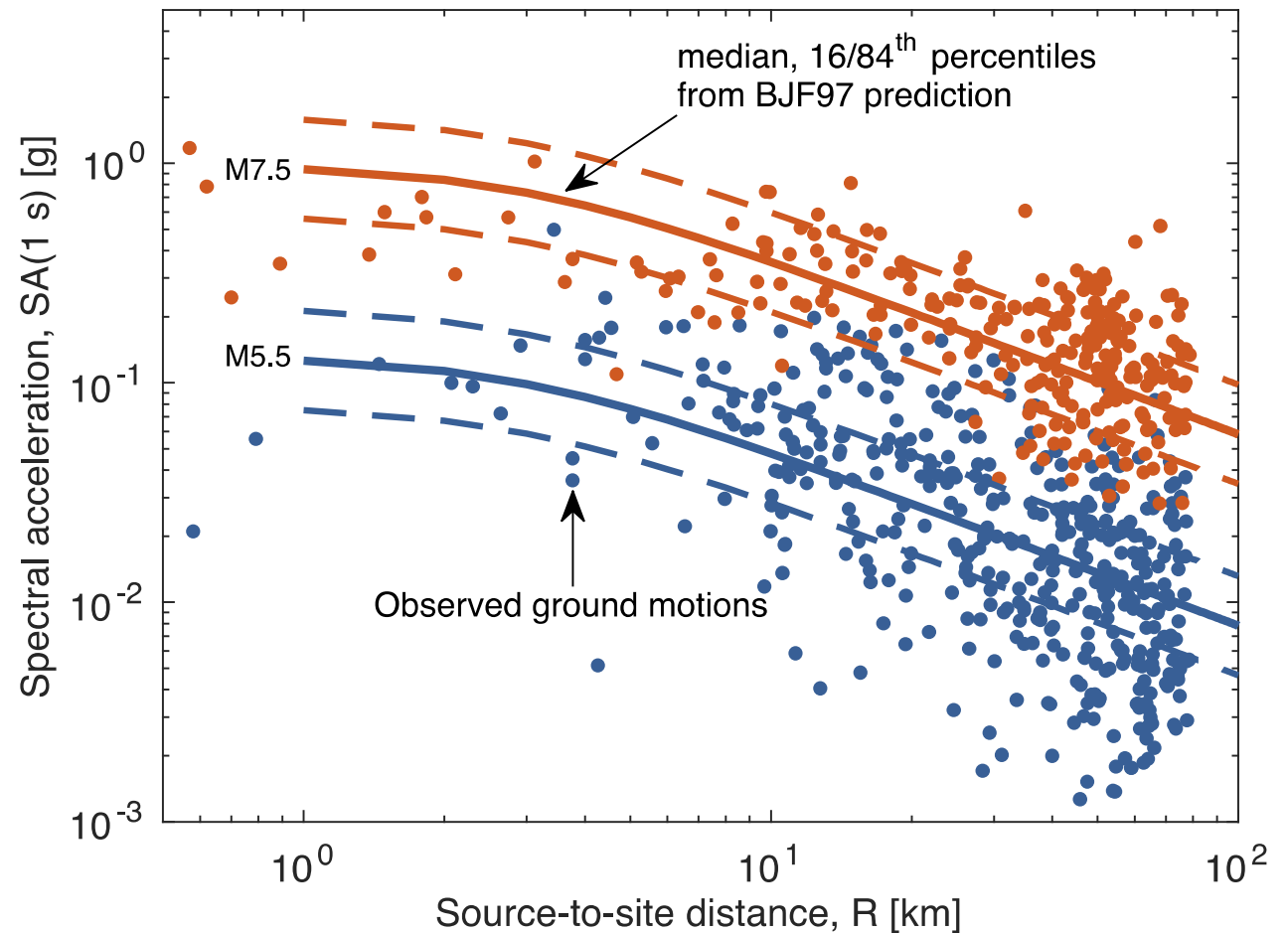


C. Amendola

Empirical Ground Motion Models (GMMs)

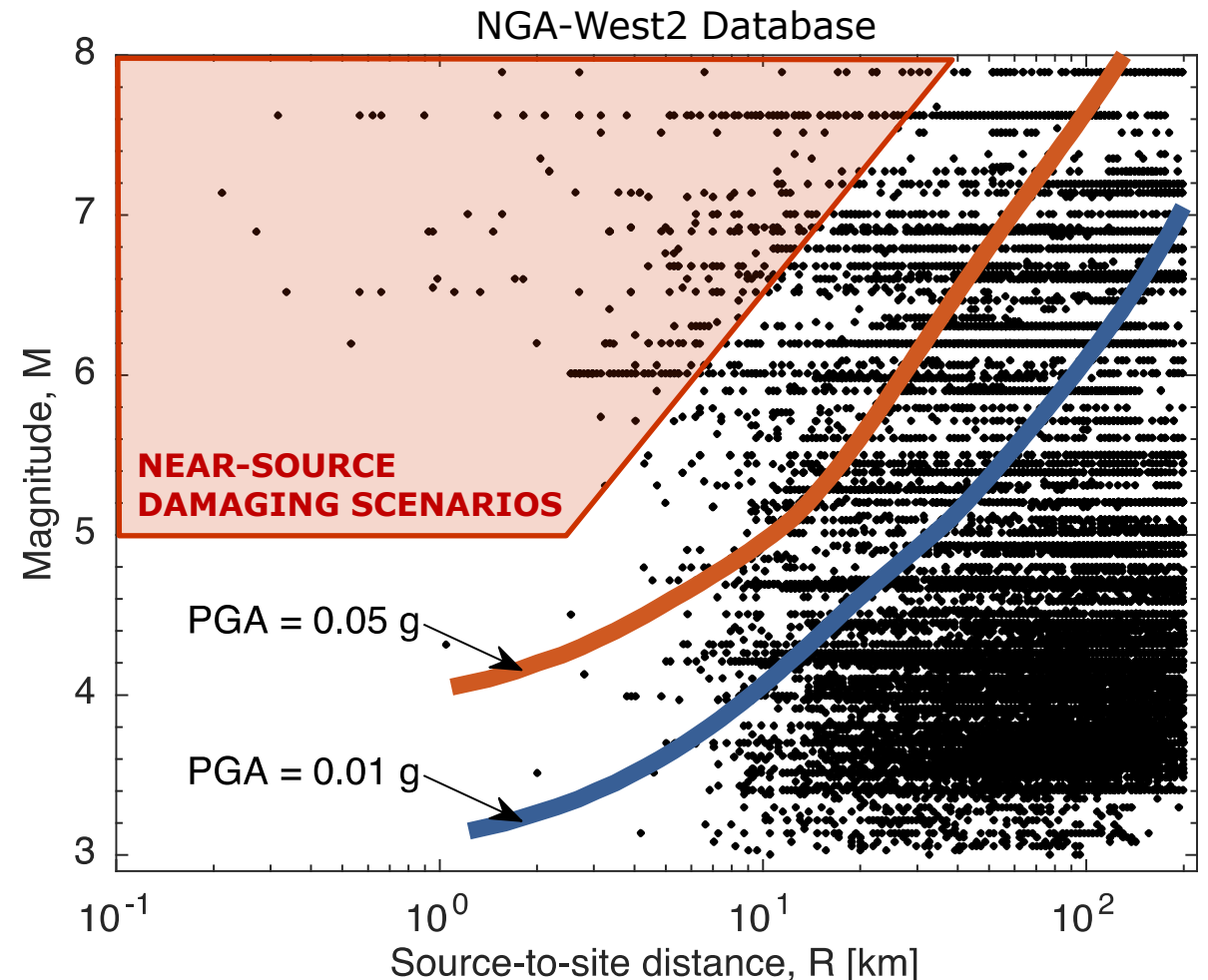
The **standard approach** for ground motion estimation relies on **empirical GMMs** which provide the probability distribution of ground motion intensity measures as a function of basic explanatory variables (magnitude, source-to-site distance, site conditions,...)

- Data-driven
- Ease of use within probabilistic frameworks for seismic hazard and risk analyses
- Non-ergodic models



Knowledge gaps in ground motion observations and empirical modeling

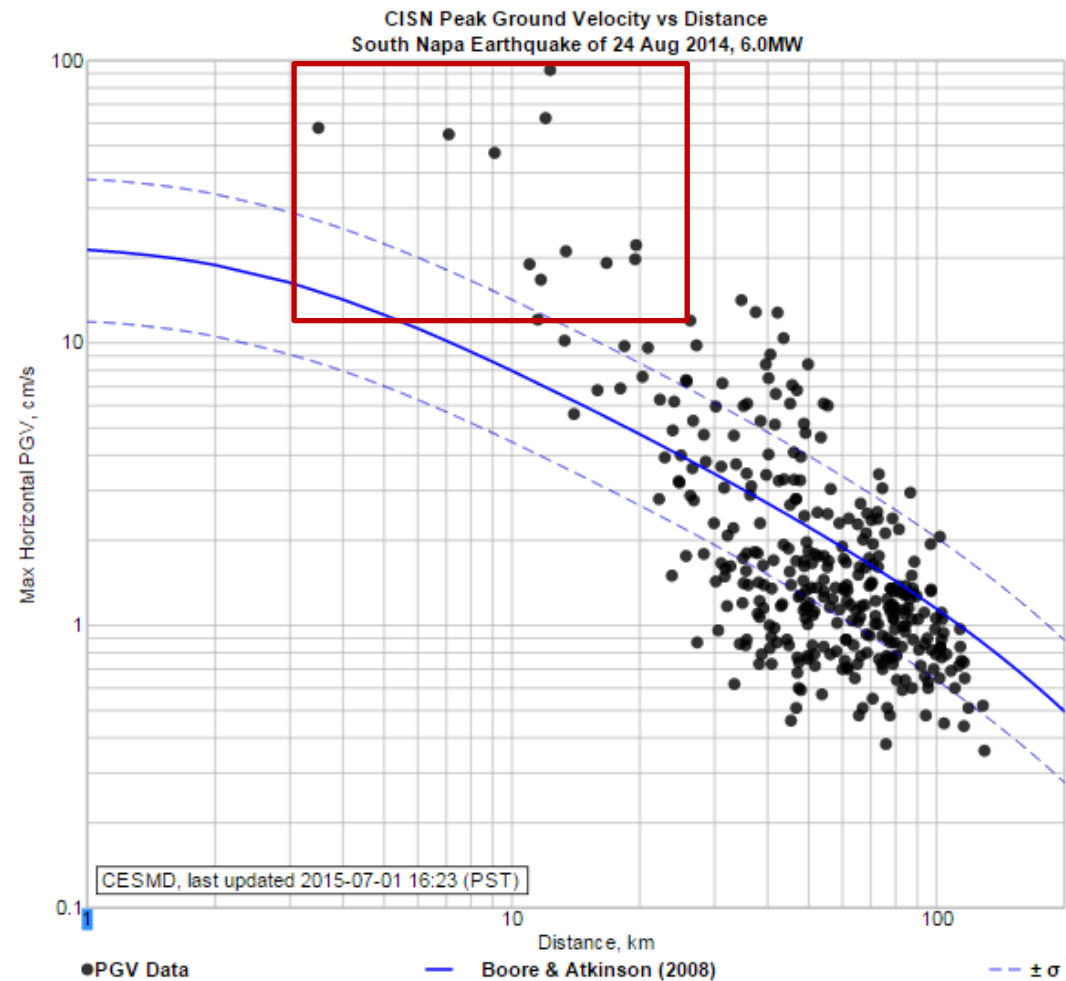
- ❑ **Sparsity of recordings** in the **near-source region**, leading to high uncertainty for damaging earthquake scenarios
- ❑ **Variability** of ground motion with respect to geographical region, fault style, site conditions (e.g. very soft soils) is typically undersampled
- ❑ **Ground motion time series**, especially from spatially dense arrays, are not available



Empirical Ground Motion Models (GMMs): limitations

Underestimation of recorded
peak ground motion values
at short source-to-site
distances by empirical GMMs

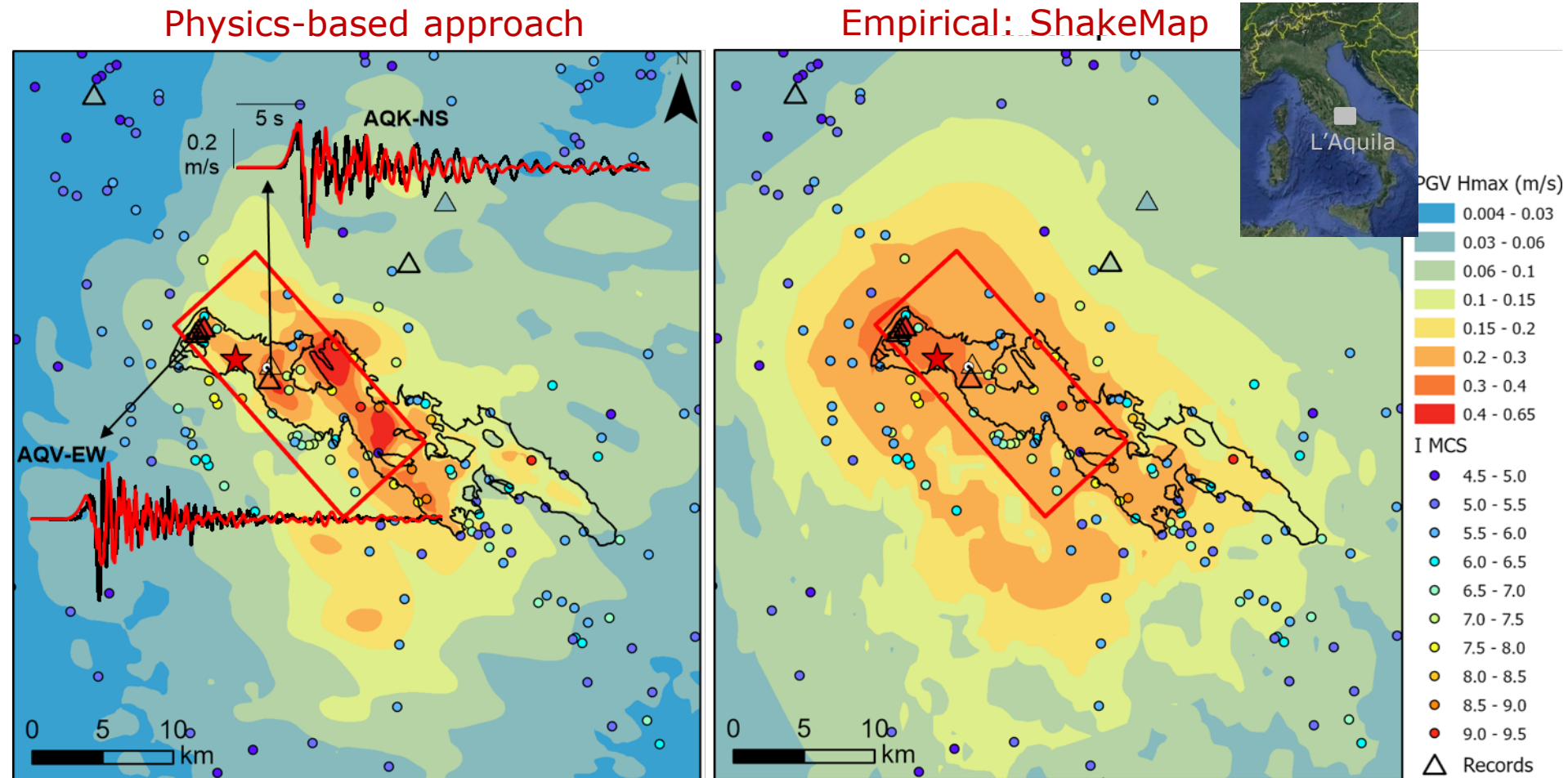
Mw6 Napa Valley earthquake
Aug 24, 2014
Source: CESMD



Empirical Ground Motion Models (GMMs): limitations

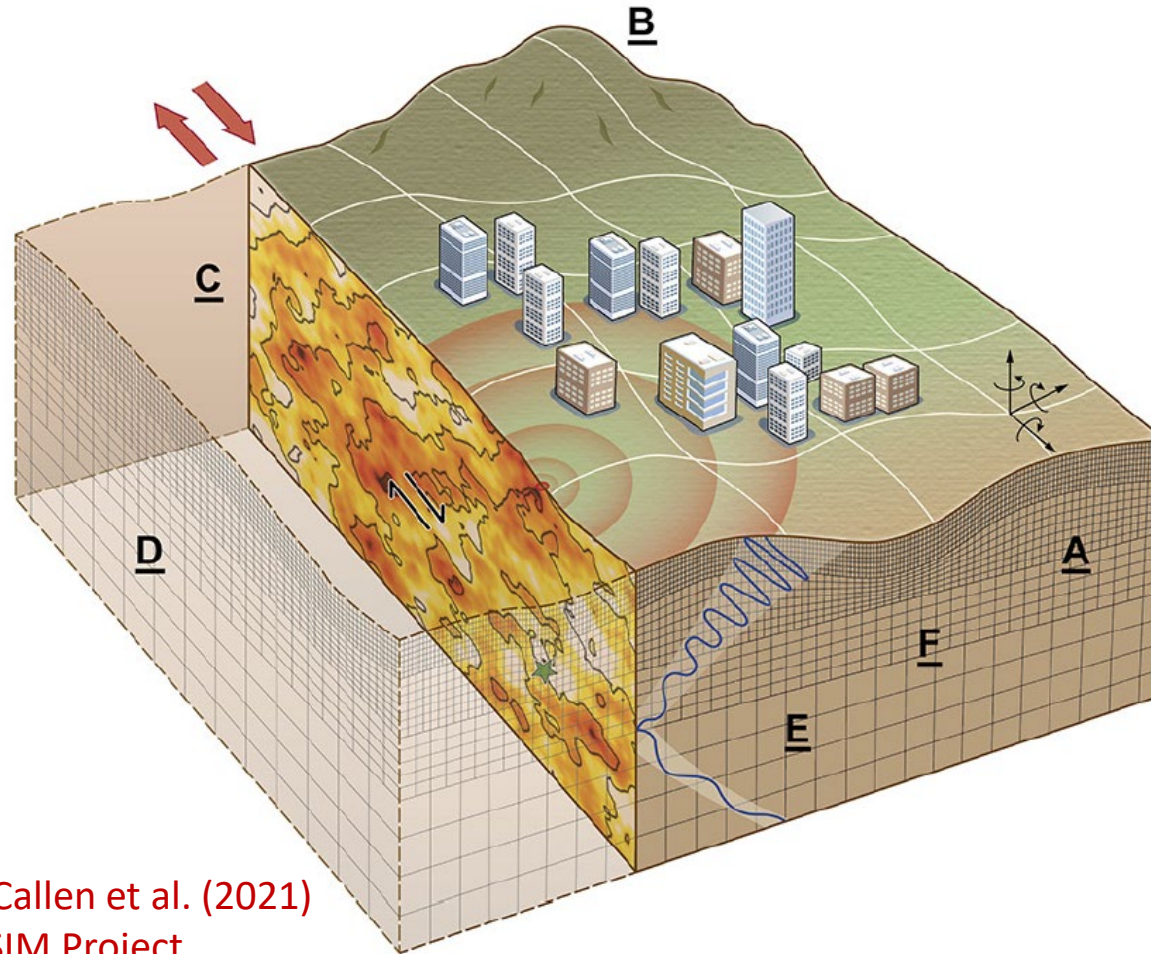
Spatial variability of ground motion is typically oversimplified in empirical GMMs

Mw6.2 Apr 6, 2009
L'Aquila earthquake,
Central Italy



Rosti et al. (2023)

Physics-based numerical simulation (PBS) of earthquake ground motion



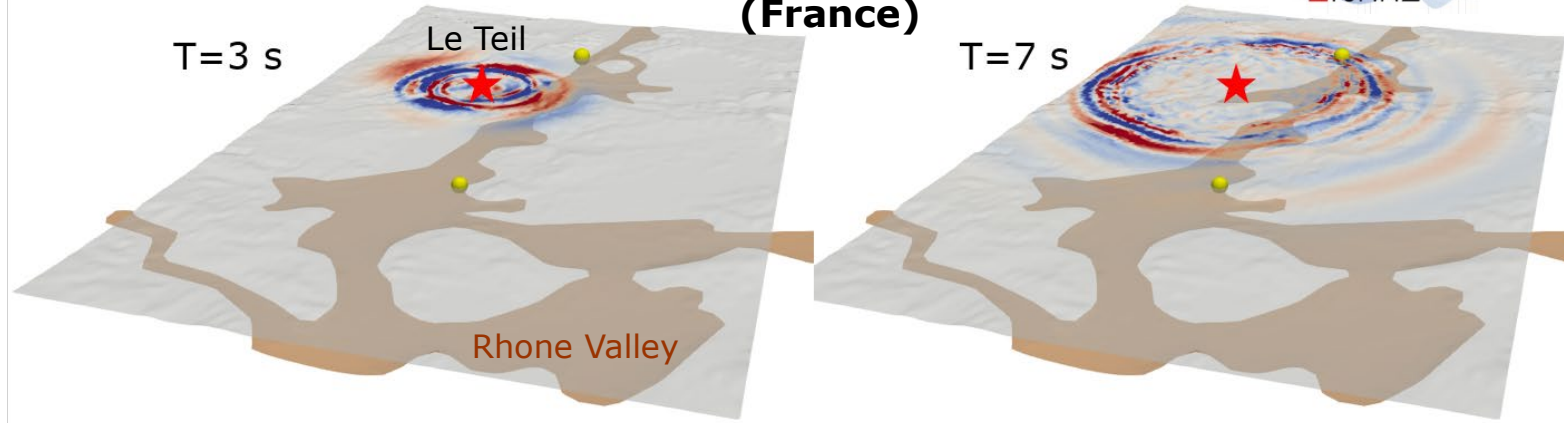
- “Source-to-site(-to-structure)” numerical simulation of seismic wave propagation, including:
- seismic source
 - source-to-site propagation path in heterogeneous Earth media
 - local site effects due to 3D geological and topographical features
 - ...up to buildings in urbanized environments

Computer code for PBS: SPEED@PoliMI

Mw4.9 2019 Le Teil earthquake (France)

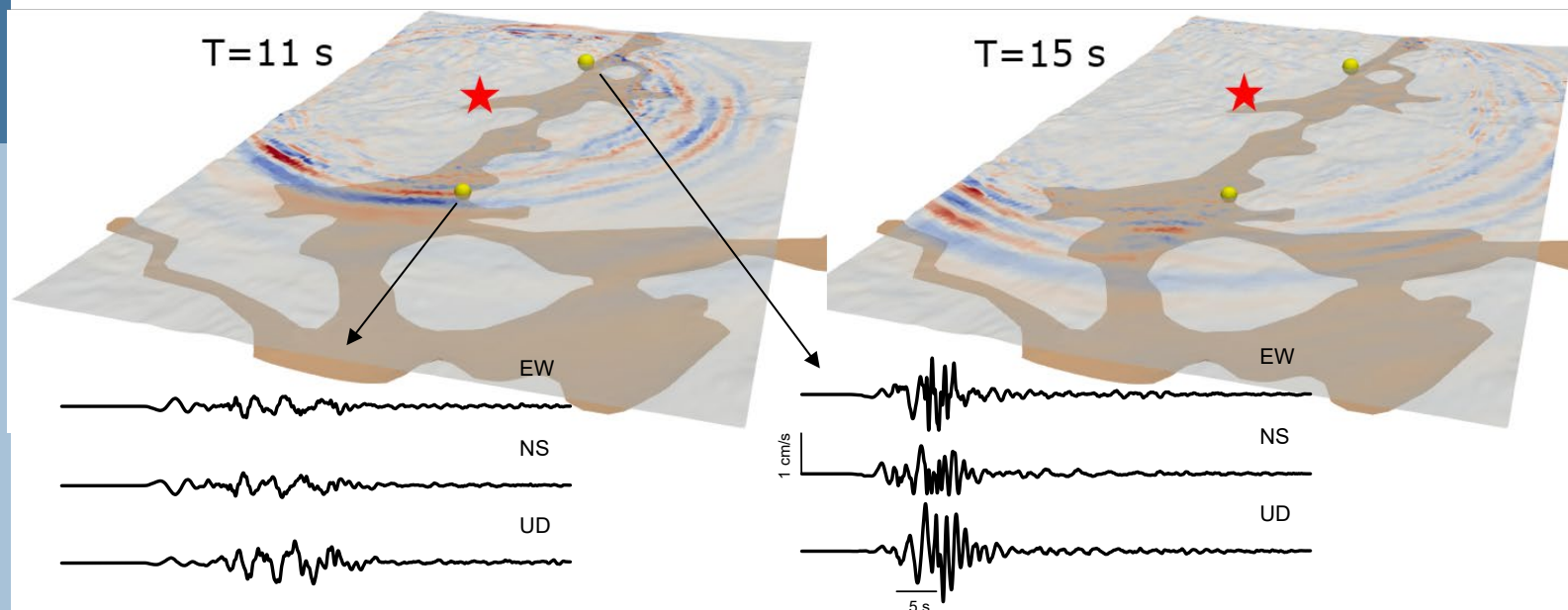


Antonietti et al. (2012), Mazzieri et al. (2013)



SPectral **E**lements in
Elastodynamics with
Discontinuous Galerkin

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



**General requirements on
the numerical scheme**

- ✓ Accuracy
- ✓ Flexibility
- ✓ Scalability / Efficiency

Workflow to generate regional-scale PBS

INPUT DATA

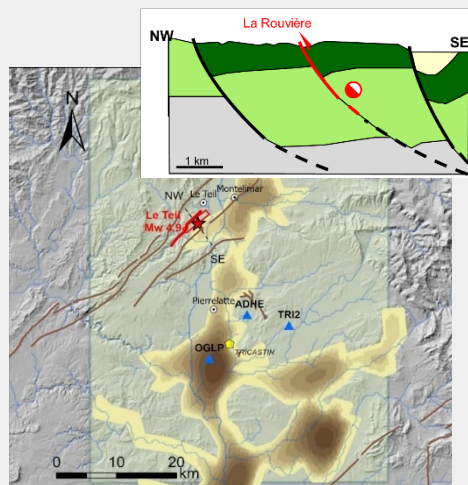
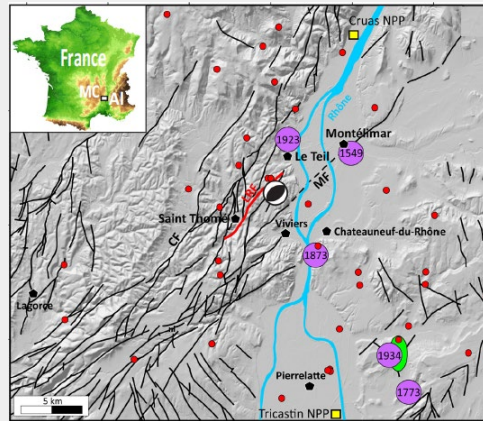
SEISMOTECTONIC
CONTEXT
(FAULTS)

+

TOPOGRAPHY
/BATHYMETRY

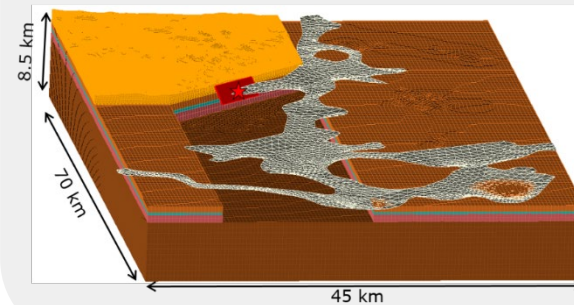
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GEOLOGICAL-
GEOTECHNICAL
-GEOPHYSICAL
MODEL

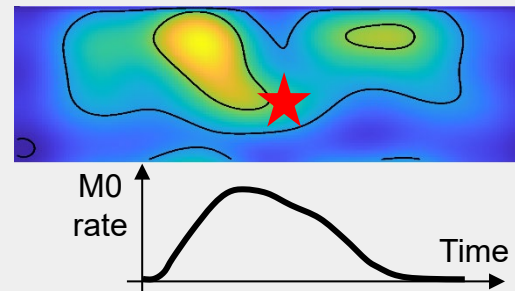


2019 Mw4.9 Le Teil earthquake

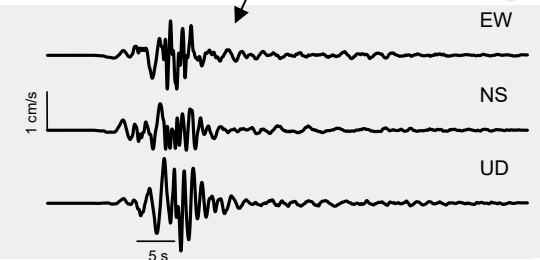
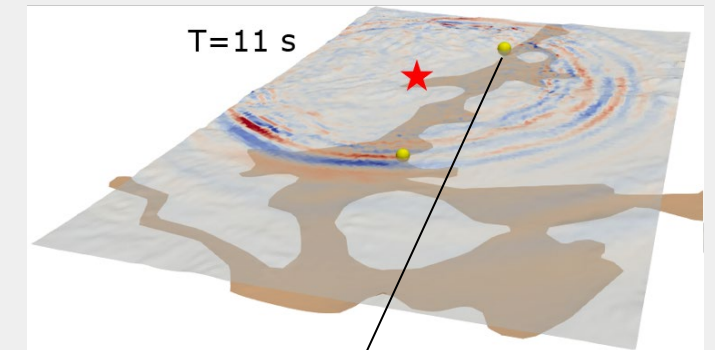
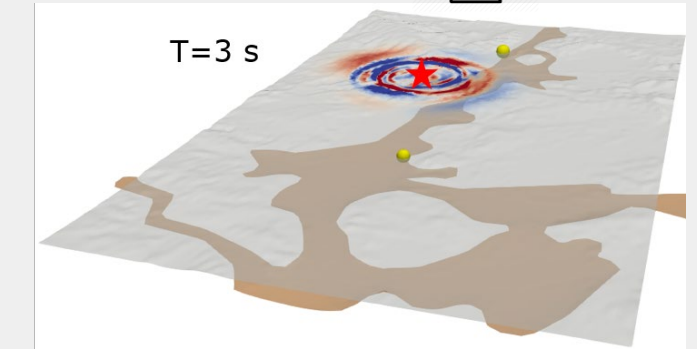
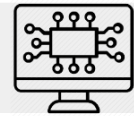
SET-UP OF THE 3D NUMERICAL MODEL



FAULT RUPTURE SCENARIO



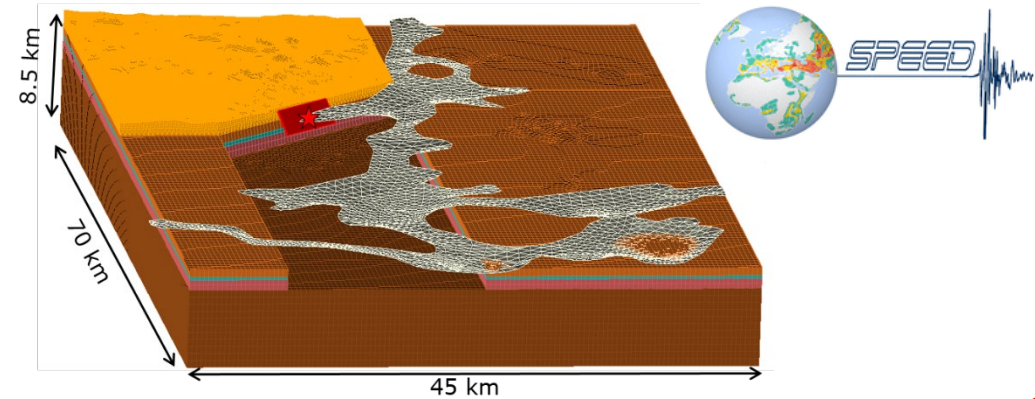
PBS



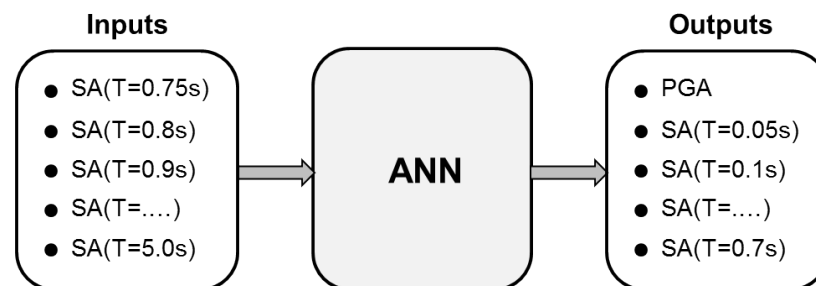
...and to compute broadband ground motions

Regional-scale 3D PBS up to f_{max} (code: SPEED)

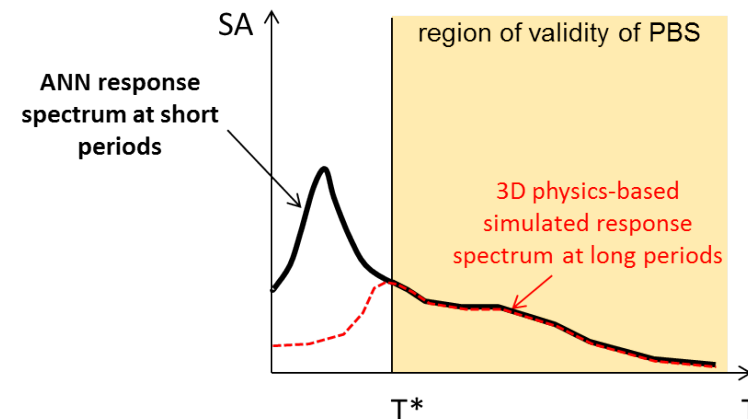
with f_{max} depending on spatial discretization and ability of velocity and source models to reproduce realistically high frequencies



Estimating Broadband (BB) Ground Motions through Artificial Neural Network (ANN2BB)



Paolucci et al. (2018) BSSA



Examples of application of PBS

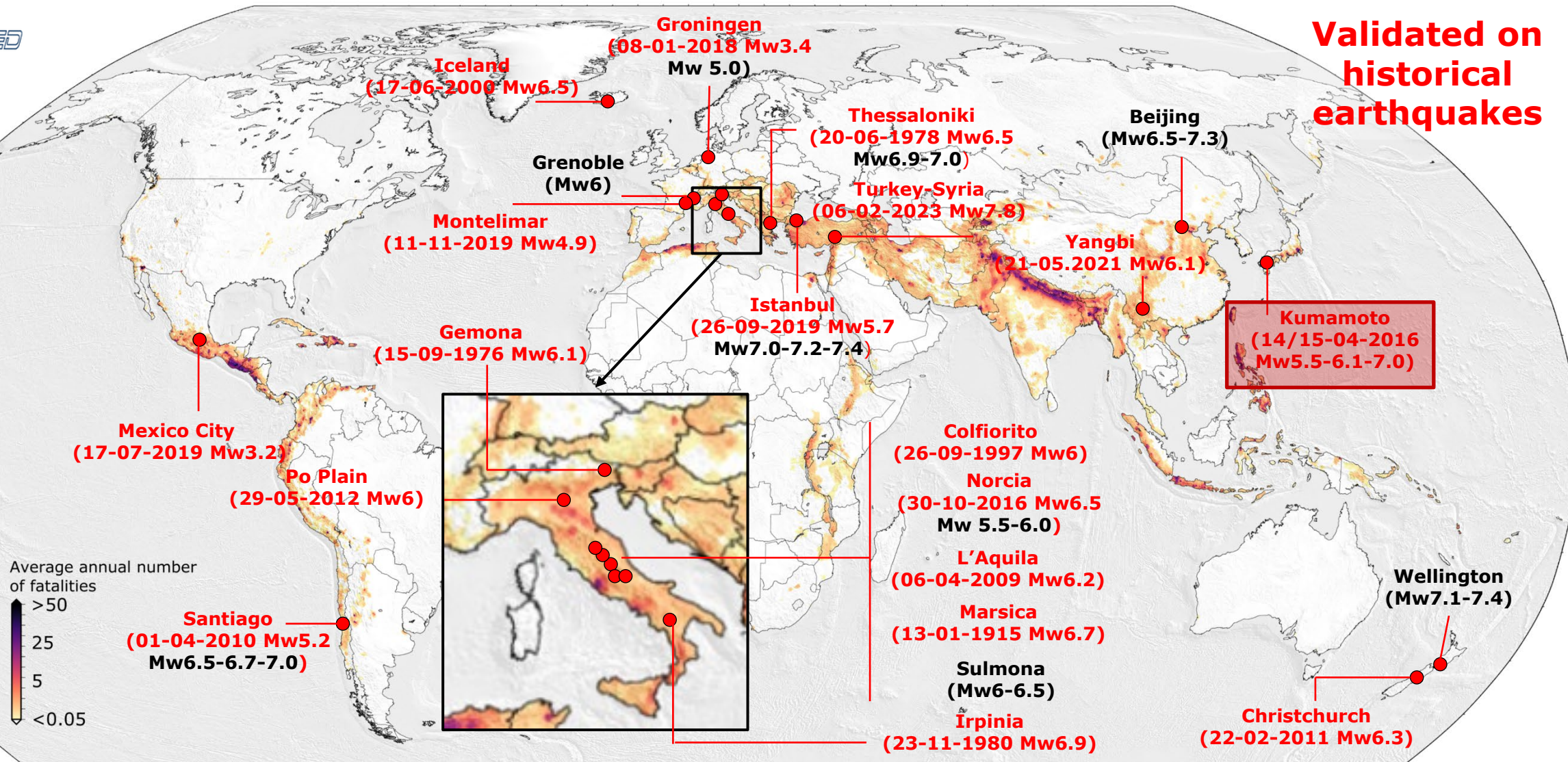
- ❑ Simulation of real earthquakes with complex source and soil behavior models
- ❑ BB-SPEEDset: a validated dataset of physics-based broadband simulated ground motions from multiple regions
- ❑ Select&Match: a software tool for ground motion selection and scaling enhanced by PBS datasets
- ❑ Utilization of simulated ground motions for structural non-linear time history analyses and for seismic fragility studies

Overview of case studies simulated by SPEED



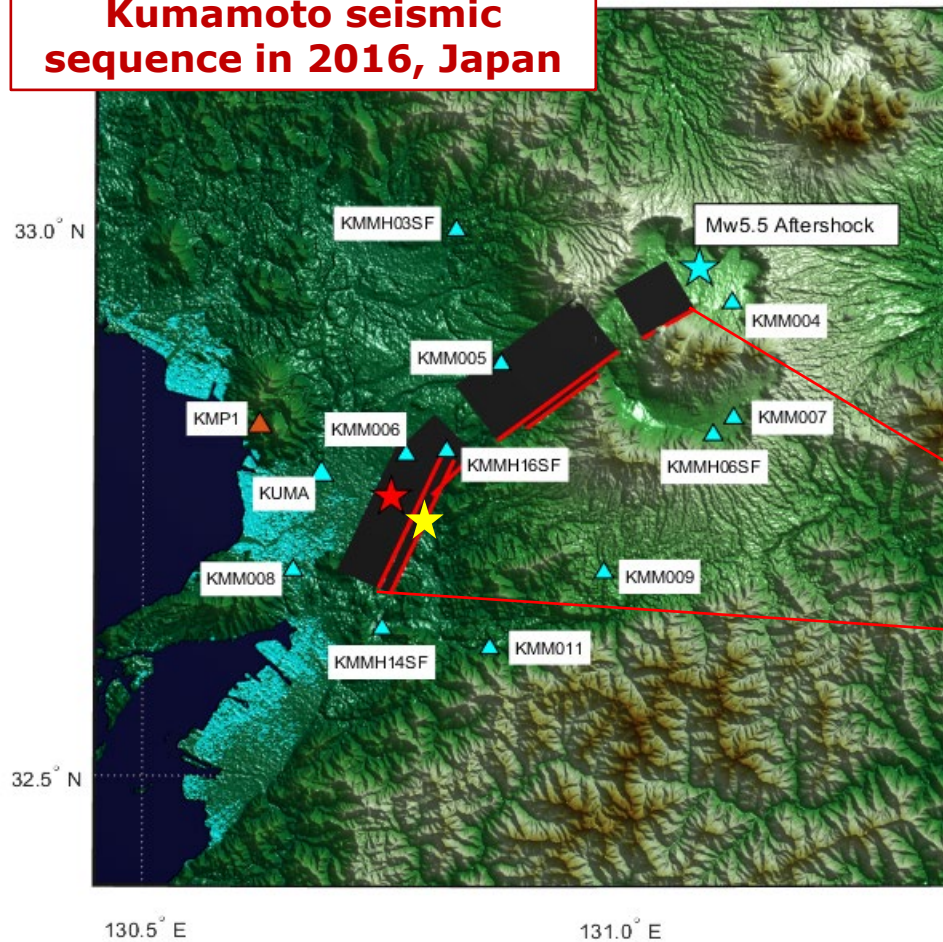
SPEED

**Validated on
historical
earthquakes**

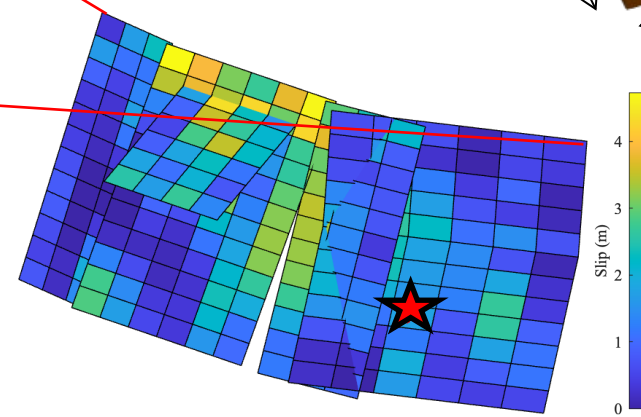
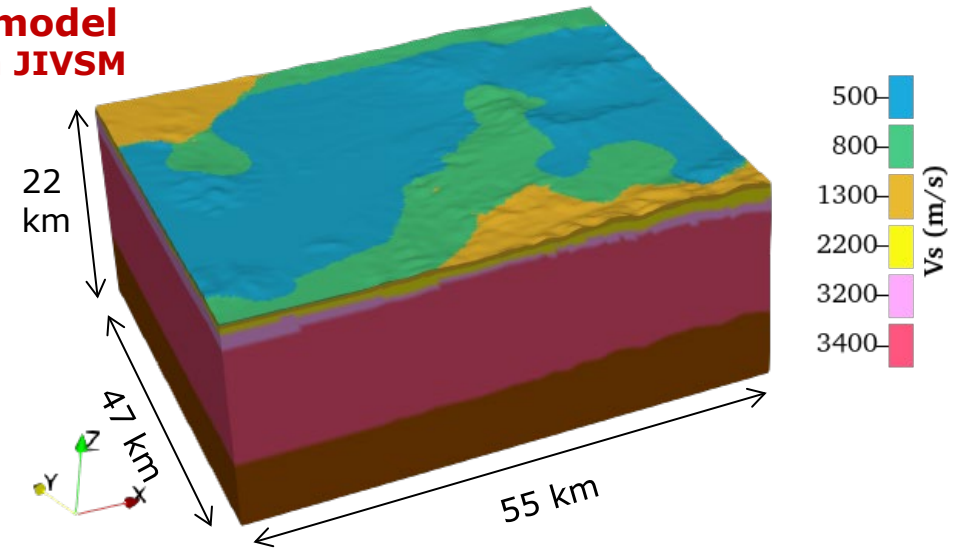


Validation on real earthquakes: the ESG6 benchmark on the 2016 Kumamoto events

Kumamoto seismic sequence in 2016, Japan



3D velocity model (Modified from JIVSM model)



- Domain size : 55 km x 47 km x 22 km. Smallest mesh size 100m.
- 1.4 Million Elements (**36M nodes**) with spectral degree of 3.
- Simulation Time : 4 Hours on 380 compute cores.

Mw7.0 multi-segment finite fault source Kobayashi et al. (2017)

★ Mw 7.0 ★ Mw 6.1 ★ Mw 5.5

Sangaraju et al (2021)

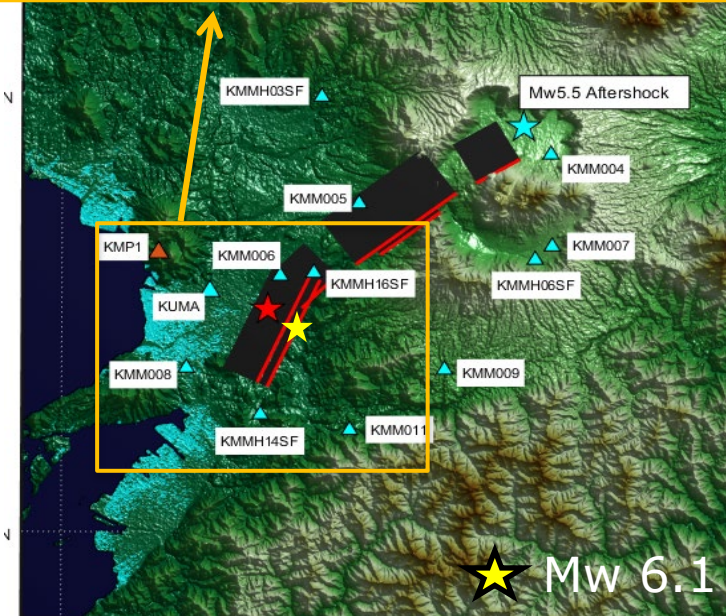
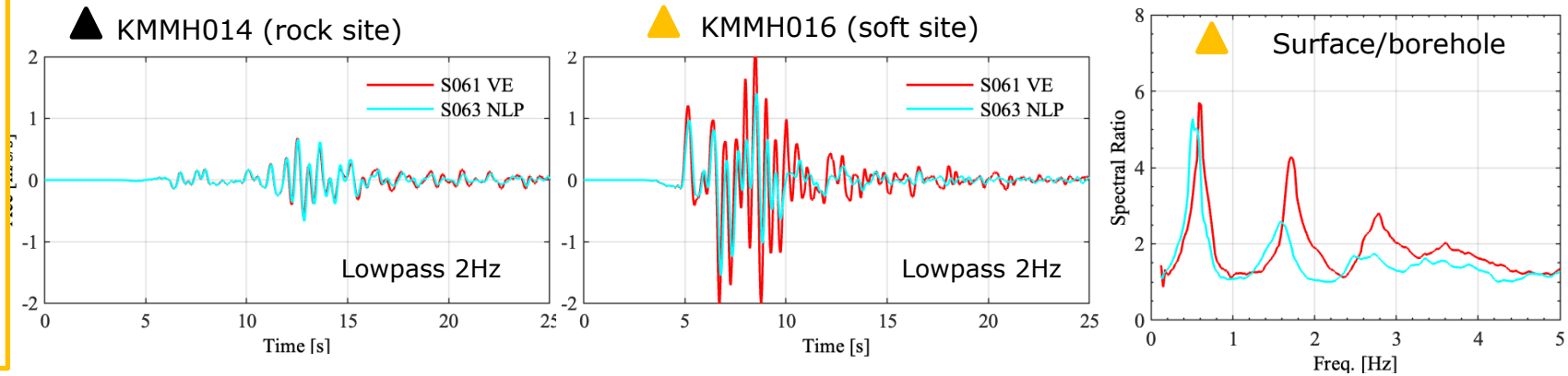
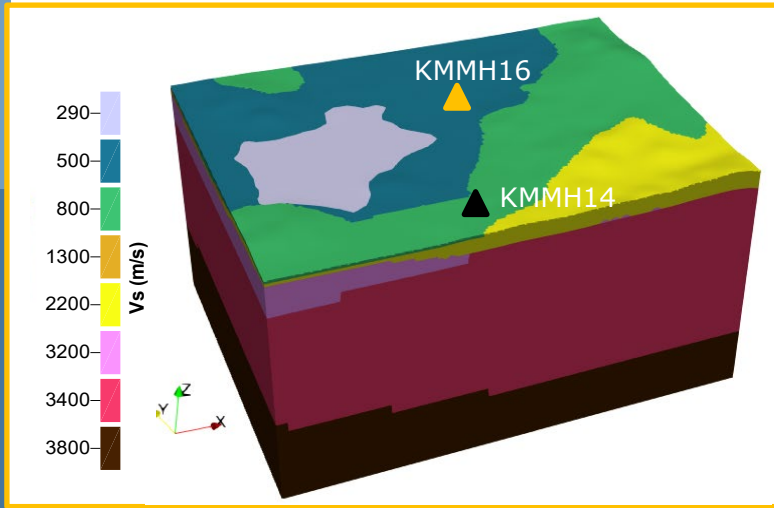
Validation on real earthquakes: the ESG6 benchmark on the 2016 Kumamoto events

Vel

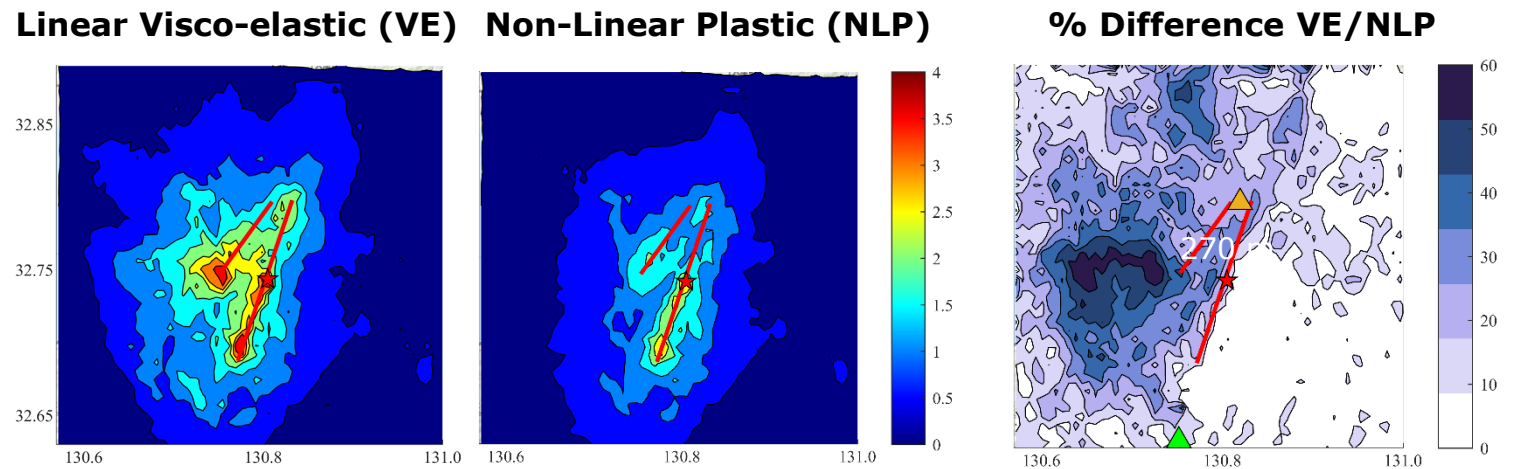


Mw6.1 Kumamoto: 3D Non-Linear Plastic (NLP) simulation

→ **NLP simulation with a new module implemented in SPEED**
(Oral, 2016; Oral & Bonilla, 2017)



Simulated Horizontal (GMH) PGA (m/s^2)

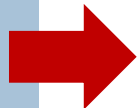


Examples of application of PBS

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International efforts towards the construction of datasets of simulated accelerograms

Database	Simulation Approach	Region	Mw-R range	References	Link
CyberShake Subset	PBS: Graves and Pitarka (2008; 2015)	California - Los Angeles	6.3-8.0 0-45 km	Baker et al. (2021)	https://zenodo.org/records/3875541
SIGMOID-TR	Stochastic Finite-Fault: EXSIM	Turkey	6.5-7.8 0-100 km	Altindal & Askan (2023)	https://zenodo.org/records/7007918
PEER-SGD	PBS: Finite Difference SW4 – EQSIM	California - San Francisco	<i>Under development</i>	McCallen et al. (2024)	
BB-SPEEDset v2.3	PBS: Spectral Element SPEED	Worldwide	4.9-7.4 0-110 km	Paolucci et al. (2021), Smerzini et al. (2024)	https://speed.mox.polimi.it/bb-speedset/

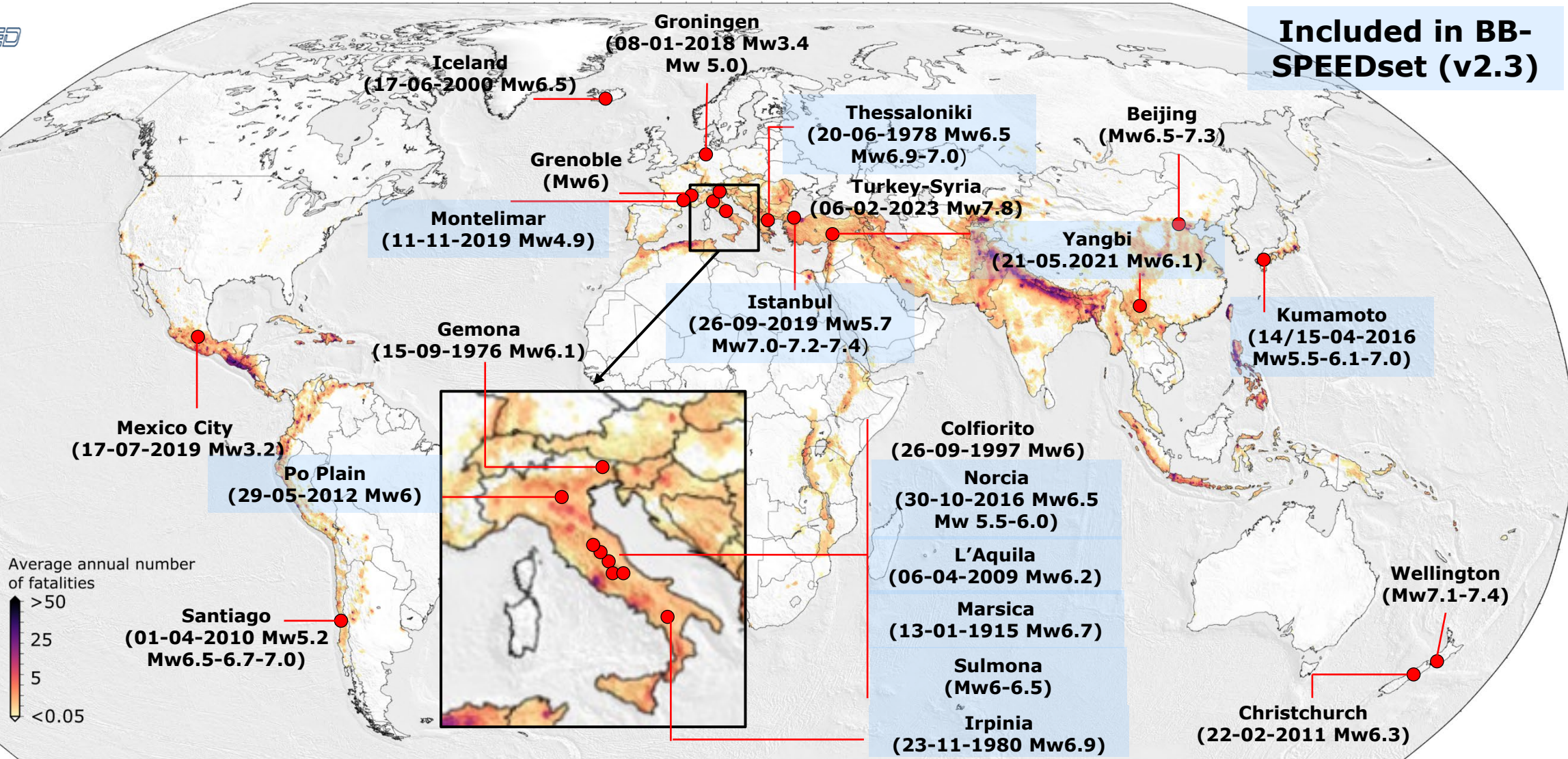


Construction of BB-SPEEDset (v1.0 → v2.3)



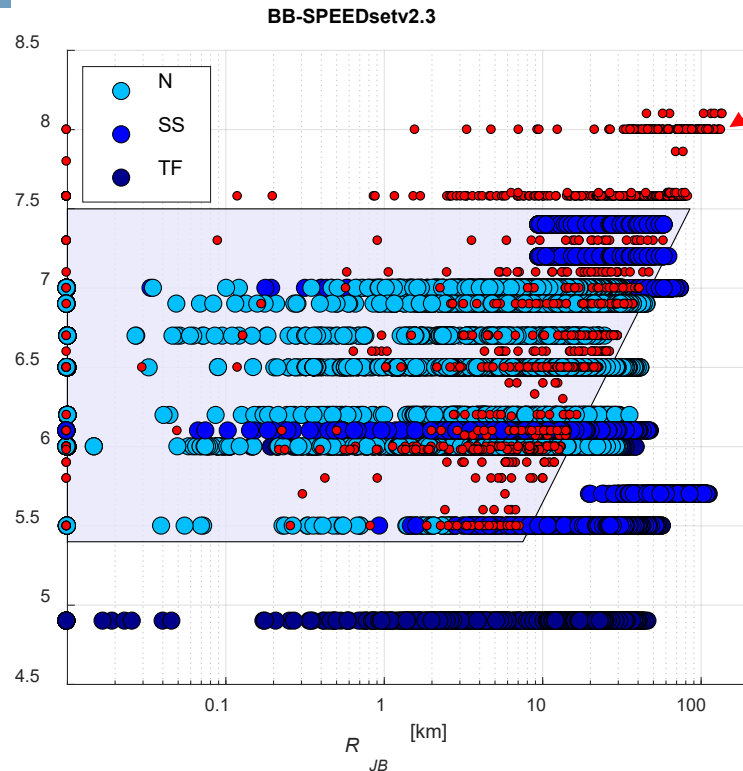
SPEED

Included in BB-SPEEDset (v2.3)



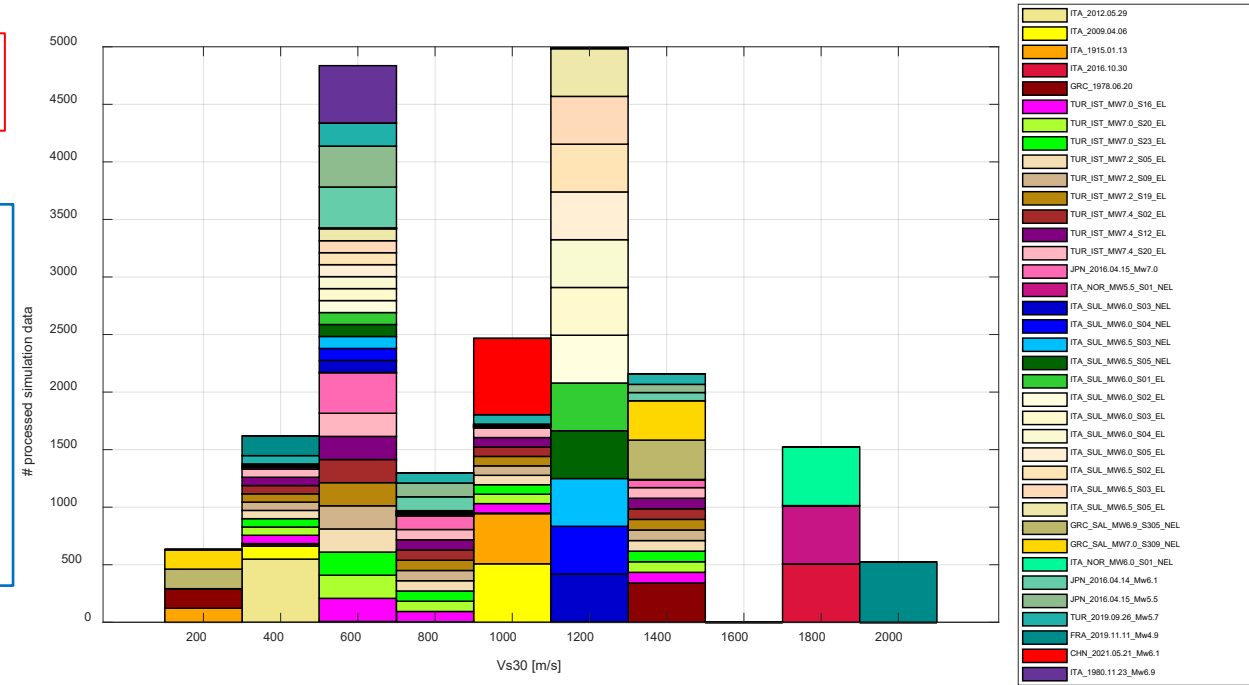
BB-SPEEDset (v2.3): a dataset of near-source accelerograms from PBS

M_w - R_{jb} and V_{S30} distribution of BB-SPEEDset



NESS2.0
(Sgobba et al. 2021)

BB-SPEEDset v2.3:
 - 37 scenarios (12 validations + 25 scenarios)
 - 55% N; 38% SS;
 6% TF
 - 75% $V_{S30} > 600$ m/s;
 1% $V_{S30} < 200$ m/s



BB-SPEEDset: A Validated Dataset of Broadband Near-Source Earthquake Ground Motions from 3D Physics-Based Numerical Simulations

Roberto Paolucci; Chiara Smerzini; Manuela Vanini

Bulletin of the Seismological Society of America (2021) 111 (5): 2527-2545.

Open-source:

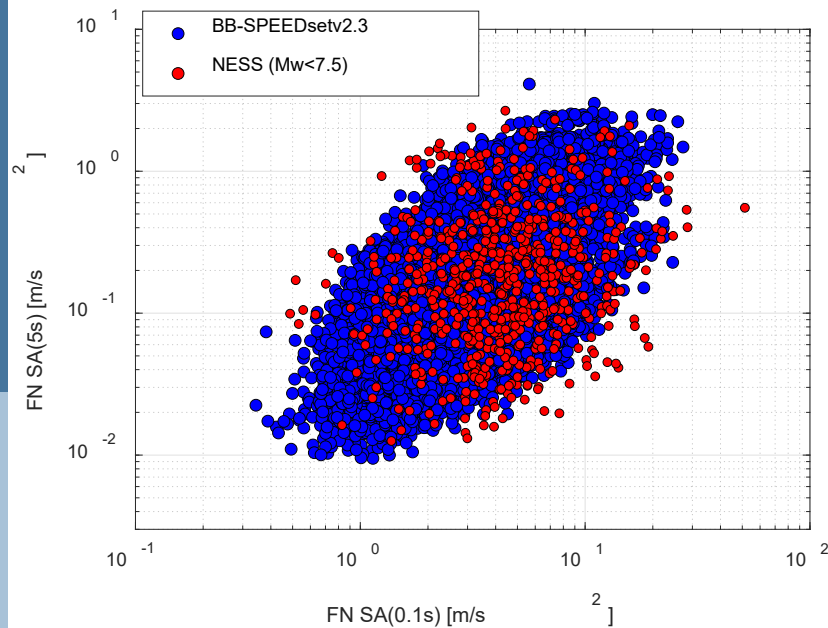
<http://speed.mox.polimi.it/bb-speedset/>

- Flatfile
- 3-component broadband accelerograms (~20'000)

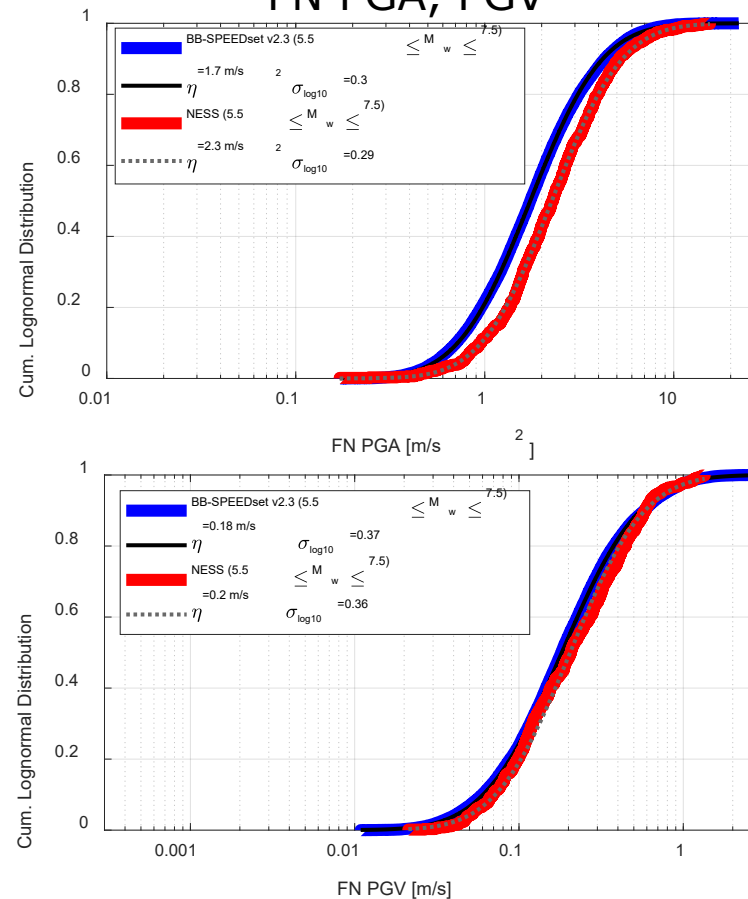
Validation tests on several ground motion features

Comparison, in the same (M_w, R) range, with respect to a dataset of near-source recordings
 NESS2.0 (Sgobba et al. 2021)

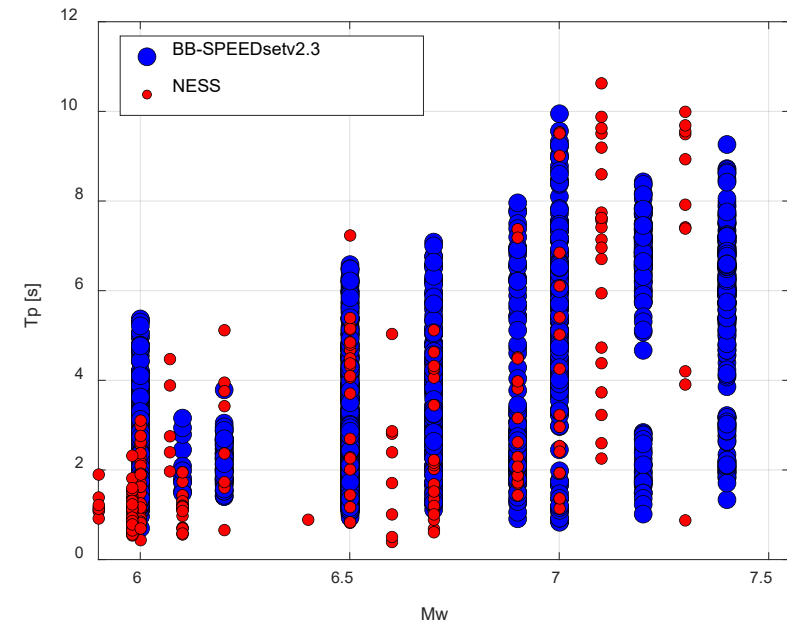
Fault Normal (FN) SA(0.1s)-
 SA(5s) correlation



Cumulative Distribution Function
 FN PGA, PGV

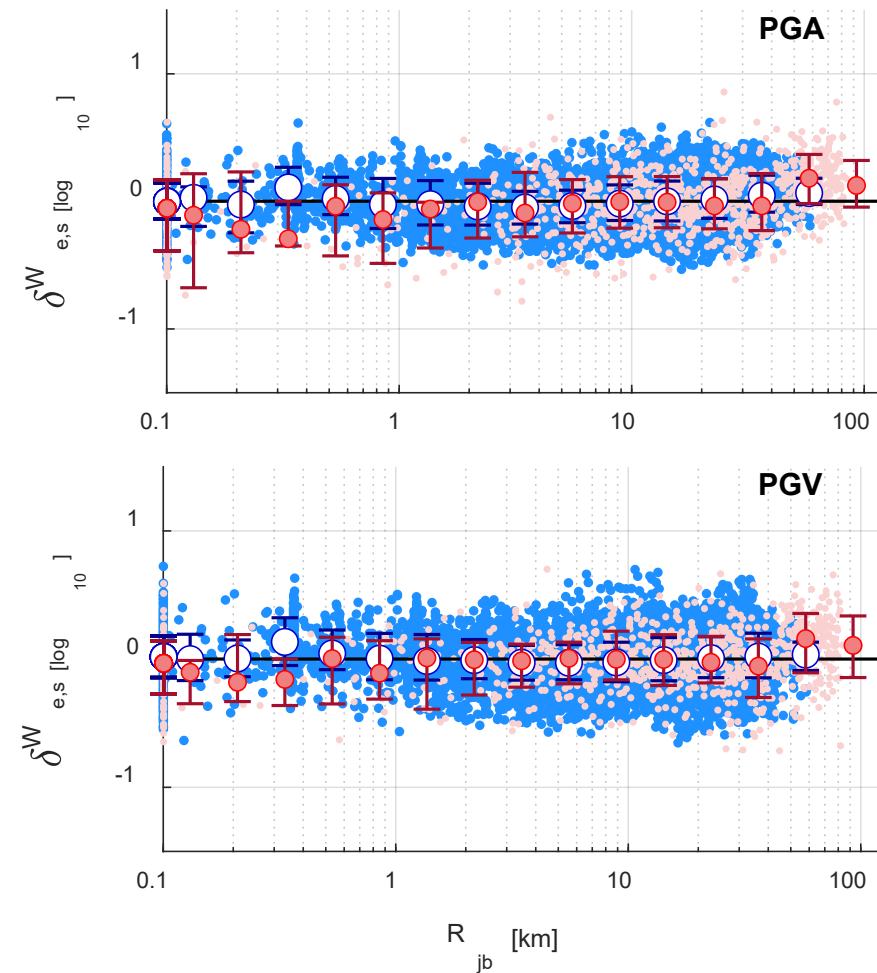
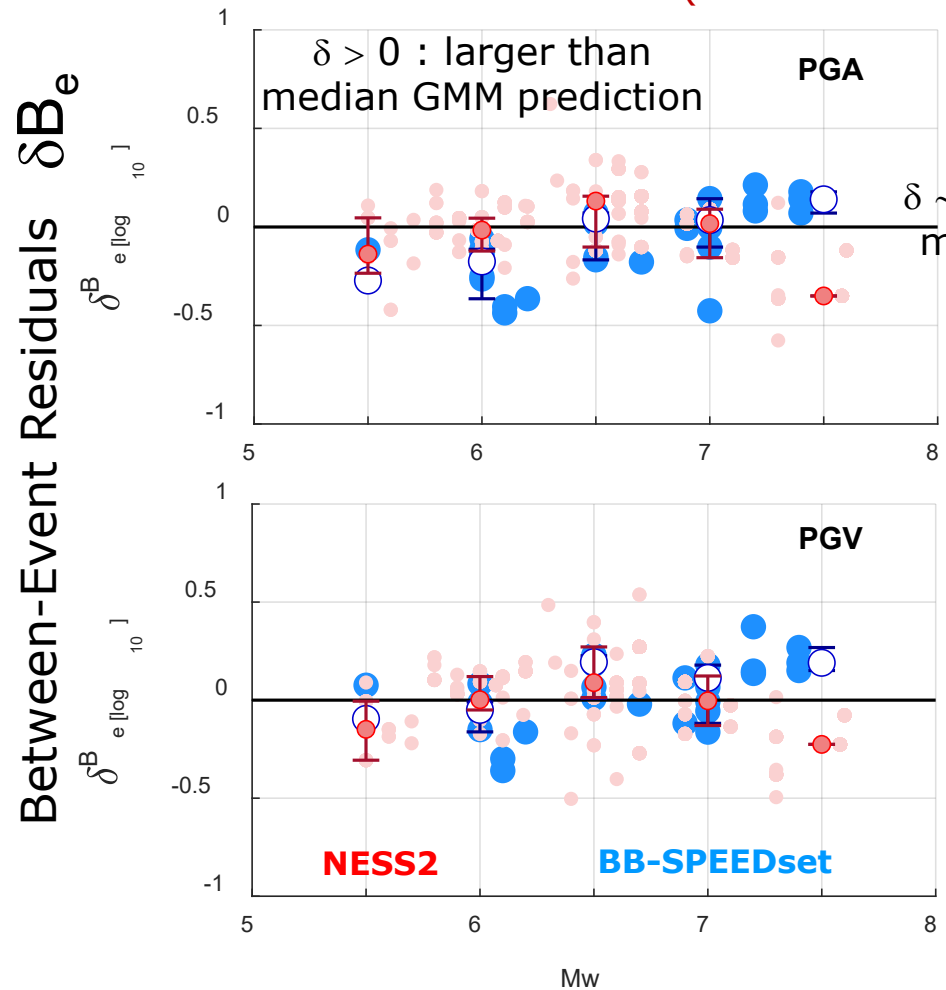


Pulse-like waveforms:
 Pulse Period T_p Vs M_w
 (Shahi and Baker, 2014)



Variability analysis of BB-SPEEDset

Between- and within-event residuals of BB-SPEEDset and NESS2 with respect to the ITA18 GMM (Lanzano et al. 2019, adjusted by near-source effects)



Within-Event Residuals δW_{es}

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Select&Match: a software tool for ground motion selection enhanced by PBS

- GM DATABASES**

 - NGA-WEST2, SIMBAD
 - BB-SPEED SET

TARGET SPECTRUM

 - USER-DEFINED
 - NORMS (EC8, ASCE)

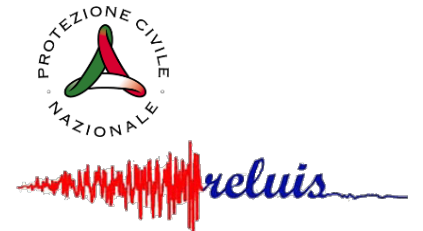
SELECTION OF A SET OF N MULTI-COMPONENT ACCELEROGRAMS APPROACHING A TARGET SPECTRUM

- SELECTION CRITERIA**
- NUM. ACCELEROGRAMS
 - M, PERIOD RANGE
 - MAX/AVG PERMIS. MISMATCH
 - SITE-CONDITIONS
 - PULSE-LIKE SELECTION
 - 3-COMPONENT
 - RANKING WEIGHTS

SPECTRAL MATCHING OF THE N SELECTED ACCELEROGRAMS (*OPTIONAL*)

- MATCHING CRITERIA**
- PERIOD RANGE
 - VARIABILITY BAND
 - PGA CONSISTENCY

SET OF N **UNSCALED OR SPECTRALLY-MATCHED REAL/SIMULATED ACCELEROGRAMS** COMPATIBLE WITH A TARGET SPECTRUM



Bulletin of Earthquake Engineering (2022) 20:4961–4987
<https://doi.org/10.1007/s10518-022-01393-0>

REVIEW ARTICLE

Selection and spectral matching of recorded ground motions for seismic fragility analyses

Vincenzo Manfredi¹ · Angelo Masi¹ · Ali Güney Özcebe² · Roberto Paolucci³ · Chiara Smerzini³

Select&Match: a software tool for ground motion selection enhanced by PBS

S&M | Accelerogram Selection

Inputs Site Class Period Ranges Weights Tolerances

Dataset: **BB-SPEEDset_v1.0** Info

Target Spectrum: **eurocode 8**

Inputs

- Number of accelerograms: 7
- Number of records per event: 1
- Spectral Ordinate: Horizontal
- Distance Range: 0 to 20
- Magnitude Range: 5.5 to 7
- Permissible mismatch: Average 0.4, Maximum 0.8
- Pulse: Only Pulse-Like Pulse % 50
- Pulse Period Range: 1 to 3

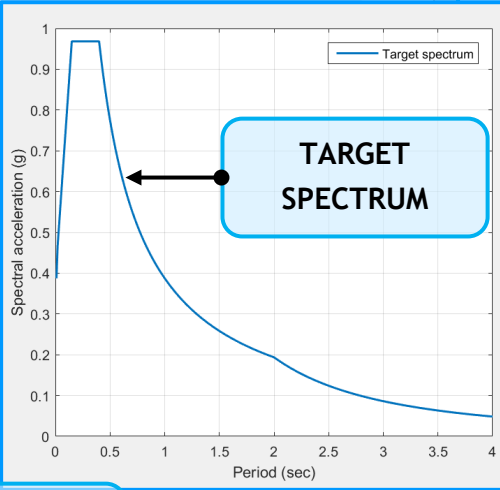
Search Modify Search... Scores... ! OK

POSSIBILITY TO SELECT PULSE-LIKE MOTIONS

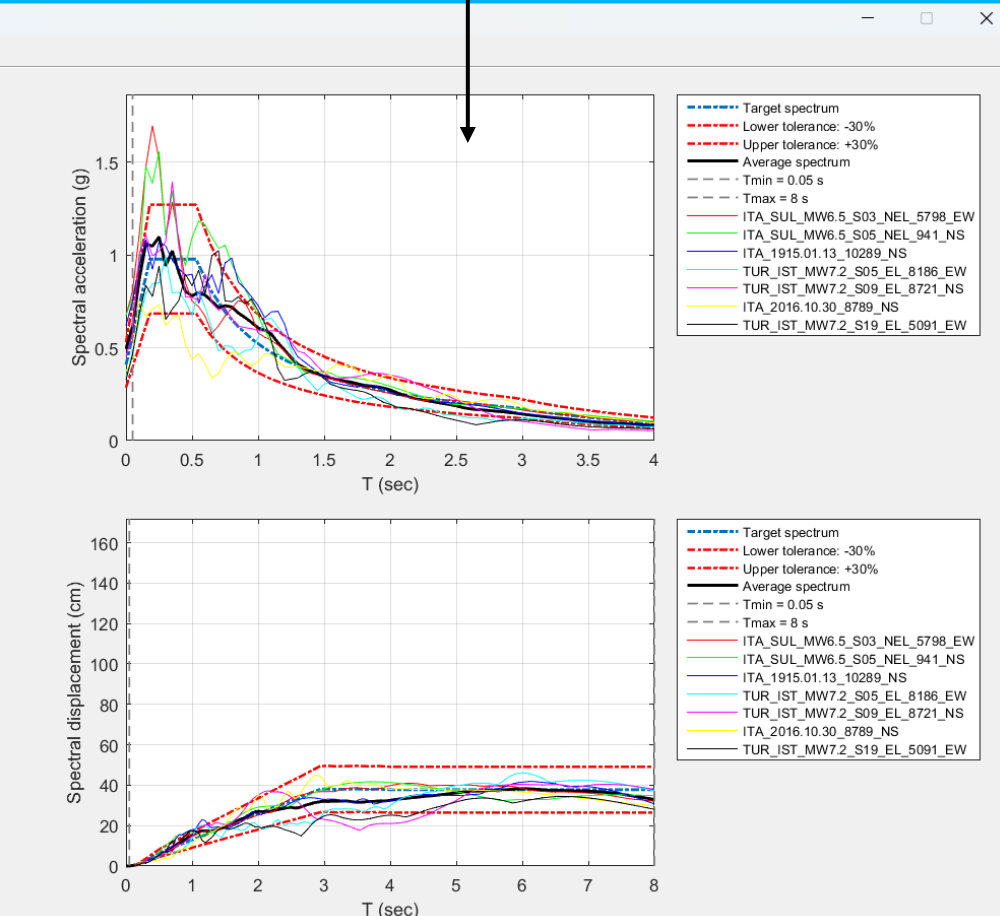
SIMULATED GM DATASET (BB-SPEED SET)

ID	FileList (12)	Dataset
1	ITA_SUL_MW6.0_S03_NEL_4294_EW	BB-SPEEDset_...
2	ITA_SUL_MW6.0_S04_NEL_129_NS	BB-SPEEDset_...
3	ITA_2009.04.06_5476_NS	BB-SPEEDset_...
4	ITA_SUL_MW6.5_S05_NEL_8575_NS	BB-SPEEDset_...
5	JPN_2016.04.14_Mw6.1_7657_EW	BB-SPEEDset_...
6	GRC_SAL_MW7.0_S01_NEL_7445_EW	BB-SPEEDset_...
7	ITA_SUL_MW6.5_S03_NEL_3238_EW	BB-SPEEDset_...
8	TUR_IST_MW7.0_S23_EL_3848_NS	BB-SPEEDset_v1
9	GRC_1978.06.20_124	
10	ITA_NOR_MW5.8_S01	
11	ITA_1915.01.13_10448	
12	JPN_2016.04.15_Mw5	

TARGET SPECTRUM



SELECTION OF A SET OF N MULTI-COMPONENT ACCELEROGRAMS APPROACHING A TARGET SPECTRUM



MULTI-COMPONENT SELECTION

Display

All Average Adjust Y Lim XLim: Primary Secondary All

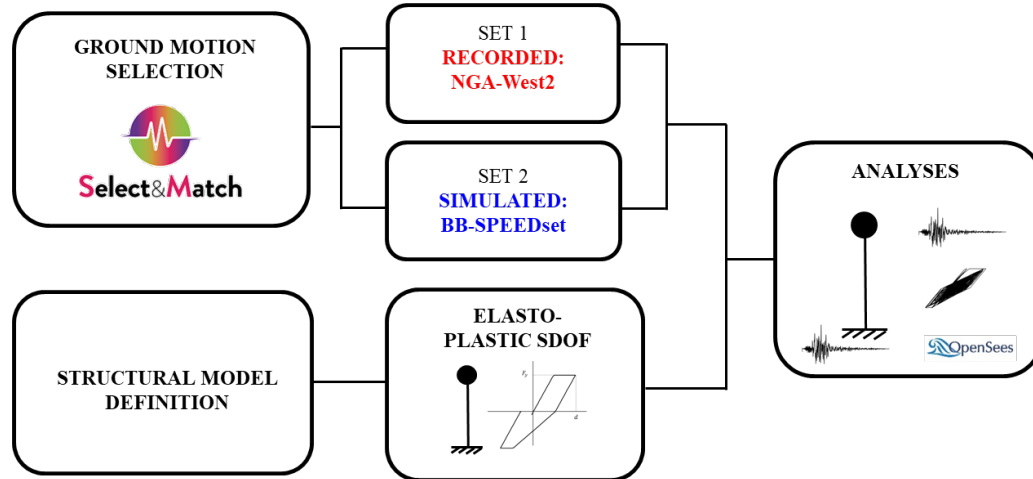
Component: H1 H2 V Log axis: X Y

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Engineering validation of BB-SPEEDset for structural non-linear dynamic analyses

Response of inelastic SDOF under compatible sets of recorded and simulated accelerograms

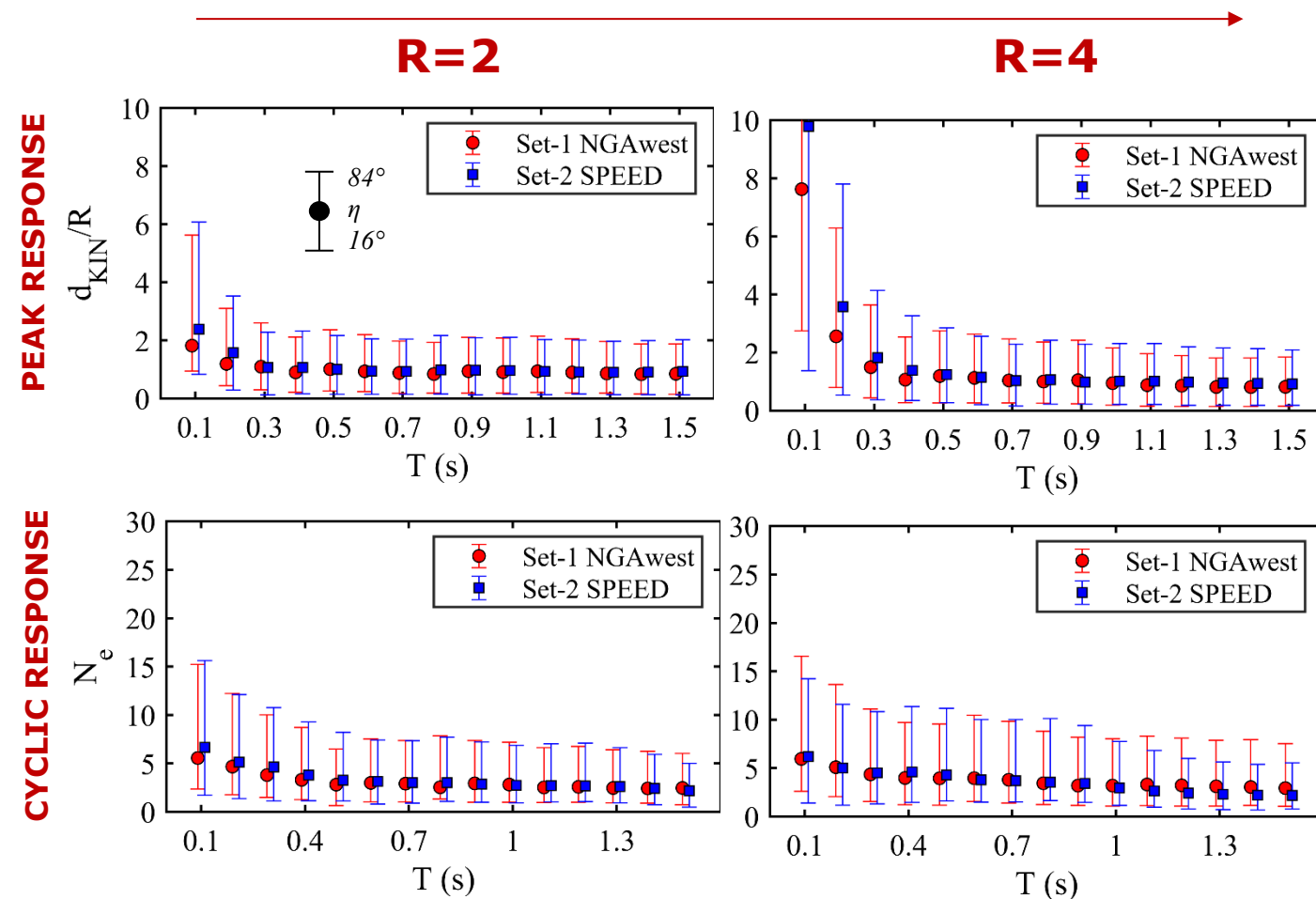


Engineering validation of BB-SPEEDset, a data set of near-source physics-based simulated accelerograms

Earthquake Spectra
1-26
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DOI: 10.1177/87552930231206766
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Sage

Chiara Smerzini¹, Chiara Amendola², Roberto Paolucci¹, and Arsalan Bazrafshan³

increasing non-linearities

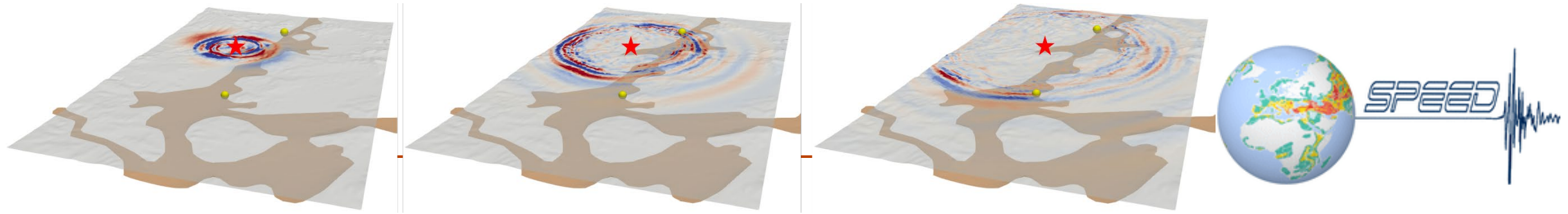


Concluding remarks

- ❑ PBS are recognized as one of the most promising tools to face the knowledge gaps due to the sparsity of recordings (**near-source** conditions, **complex geology** and **spatial variability** studies).
- ❑ However, further efforts are still needed to build **confidence in the utilization of PBS** by the seismological and engineering community.
- ❑ Availability and dissemination of **simulated ground motion datasets**, validated and embedded in accredited **ground-motion selection tools**, is a key step for broadening community access and use.
- ❑ **Validation** of simulated datasets, in a broad frequency range, for both ground motion intensity measures and engineering demand parameters, on **median** and **variability** trends, is essential as a proof of the suitability of PBS for a variety of applications.

On-going challenges

- ❑ **Simulation of real earthquakes** deserves attention to: (i) gain insights into the physics of complex interaction of seismic source, path and local site effects (including soil non-linearity), (ii) verify/validate new algorithms and (iii) to inform modelers on the application needs.
- ❑ Approaches to generate **broadband ground motions** need enhancement in such a way that the physical features of spatial variability and period-to-period correlation are preserved also at high-frequency.
- ❑ **Data and metadata format** for simulated ground motions shall be as much similar as for recorded datasets but with some specificities. Such specificities shall be shared by the international community.
- ❑ Merging of recorded and simulated datasets (data fusion) for **hybrid ground motion modeling** strategies still requires research



Thank you for your attention

Chiara Smerzini

Dept. Civil and Environmental Engineering

Politecnico di Milano

chiara.smerzini@polimi.it



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