

# Global Seismic Full Waveform Inversion

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Program in Applied & Computational Mathematics

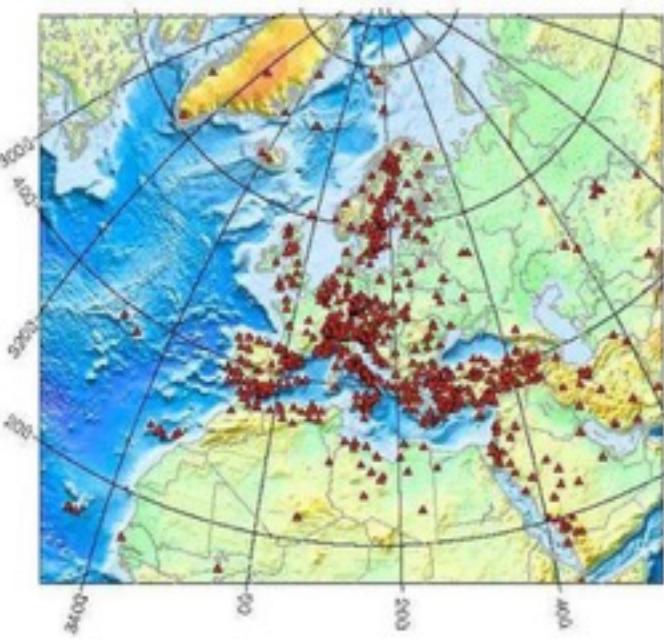
Princeton Institute for Computational Science & Engineering

Wenjie Lei, Youyi Ryan, Ebru Bozdağ, Daniel Peter, Matthieu Lefebvre & Dimitri Komatitsch

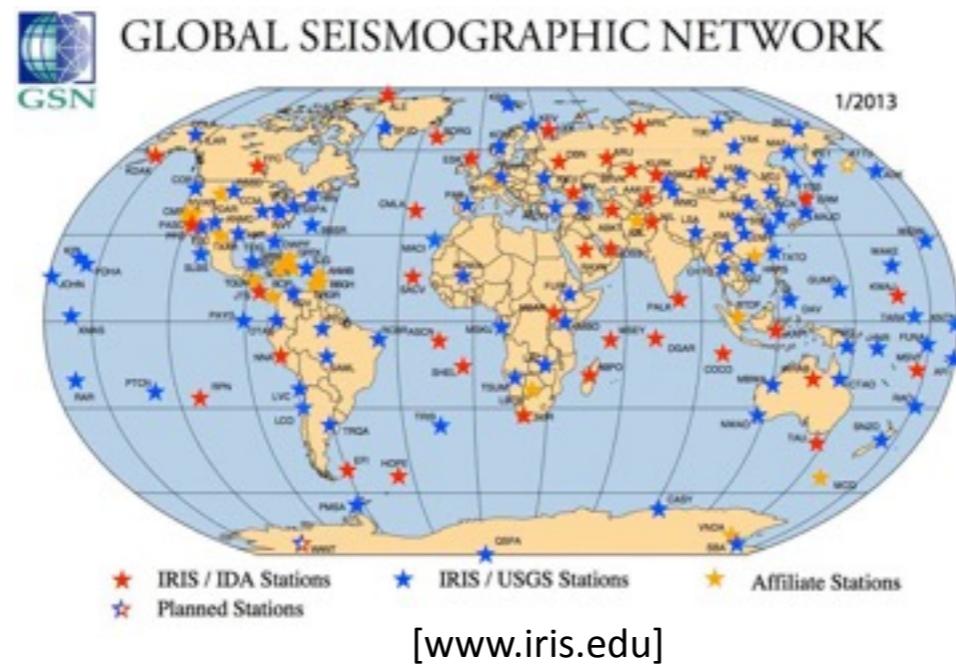
ORNL: Judy Hill, Norbert Podhorszki & David Pugmire



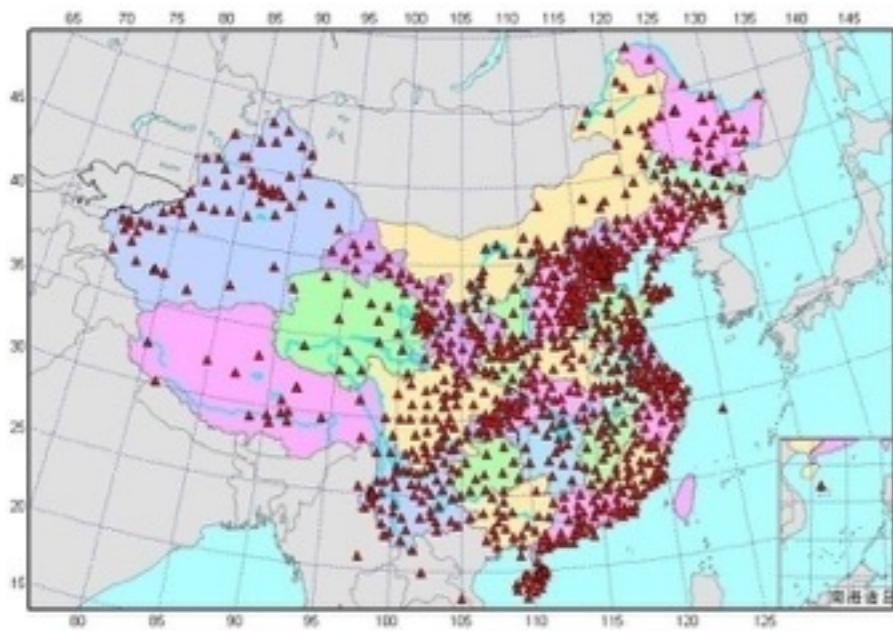
# Data Tsunami in Regional & Global Seismology



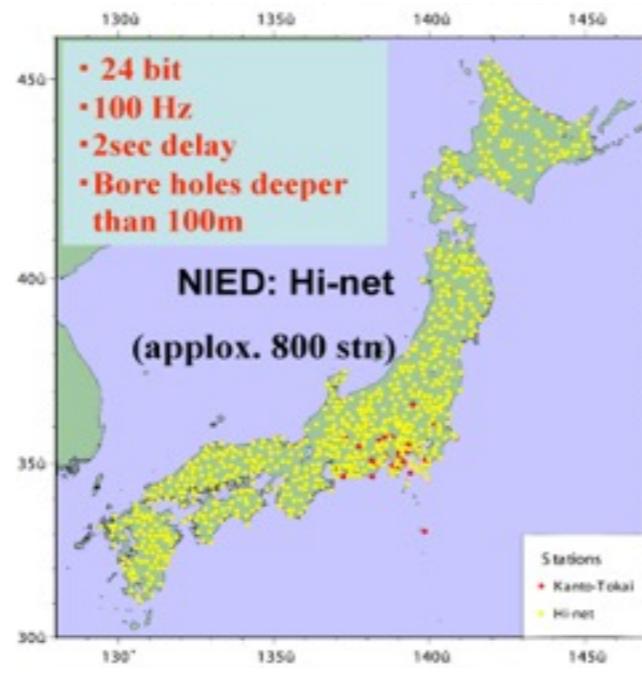
[[www.geo.uib.no](http://www.geo.uib.no)]



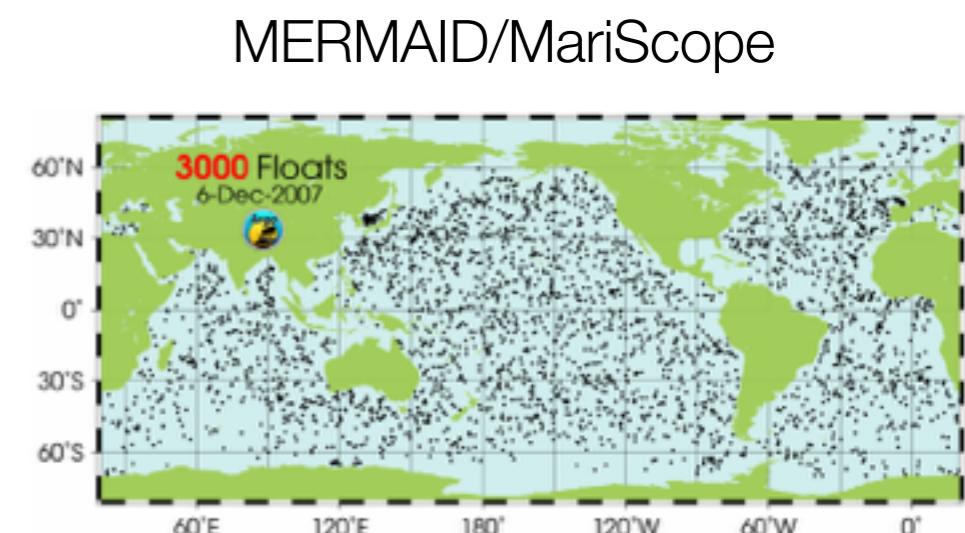
[[web.mst.edu](http://web.mst.edu)]



[[data.earthquake.cn](http://data.earthquake.cn)]



[[drh.edm.bosai.go.jp](http://drh.edm.bosai.go.jp)]



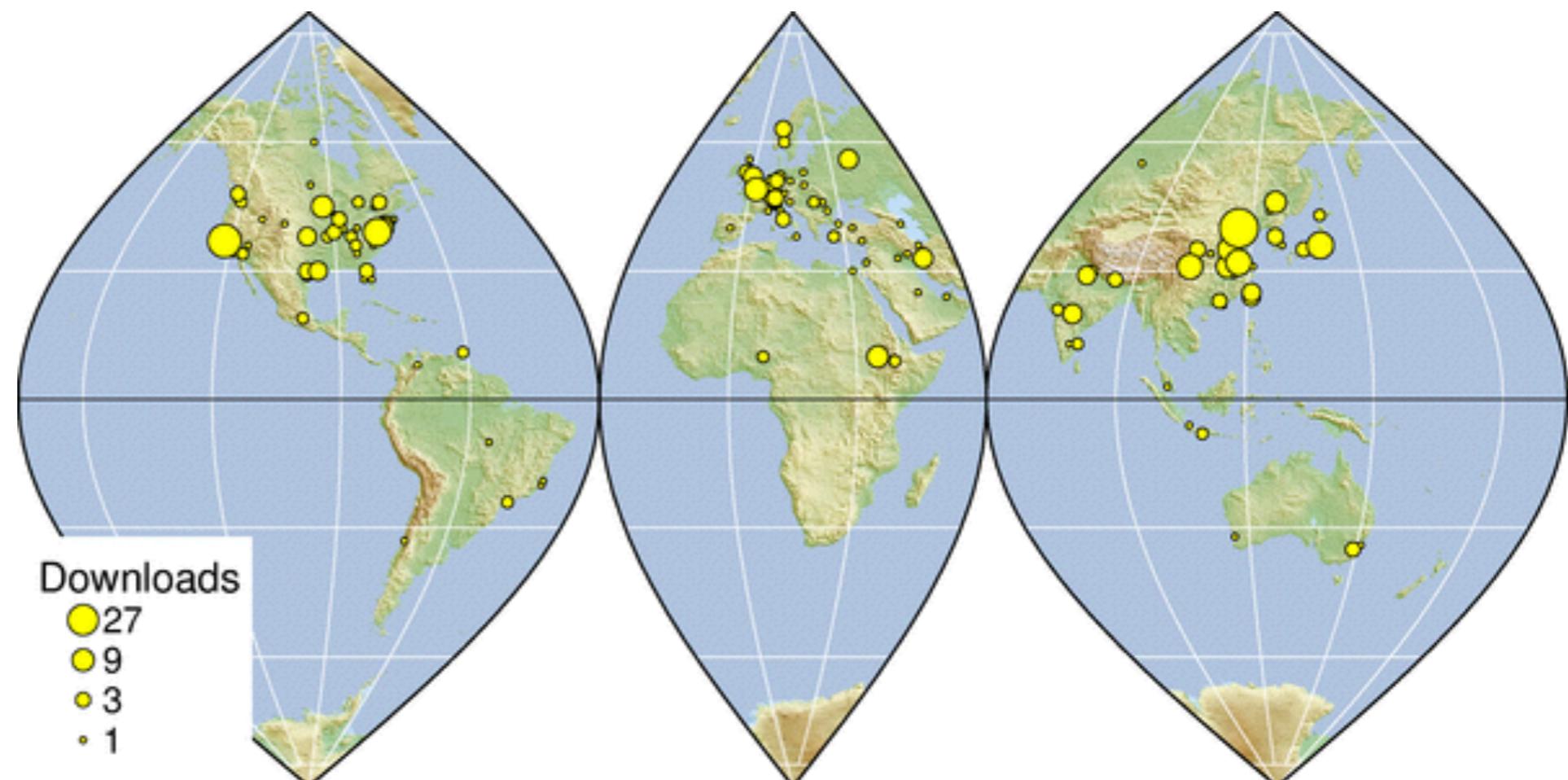
[[Simons et al, 2006](http://Simons et al, 2006)]

# Open Source Forward & Inverse Modeling Software

## Spectral-element solvers SPECFEM3D & SPECFEM3D\_GLOBE

- 3D crust and mantle models
- Topography & Bathymetry
- Rotation
- Ellipticity
- Gravitation
- Anisotropy
- Attenuation
- Adjoint capabilities
- GPU accelerated

Computational Infrastructure for Geodynamics (CIG)  
[www.geodynamics.org](http://www.geodynamics.org)



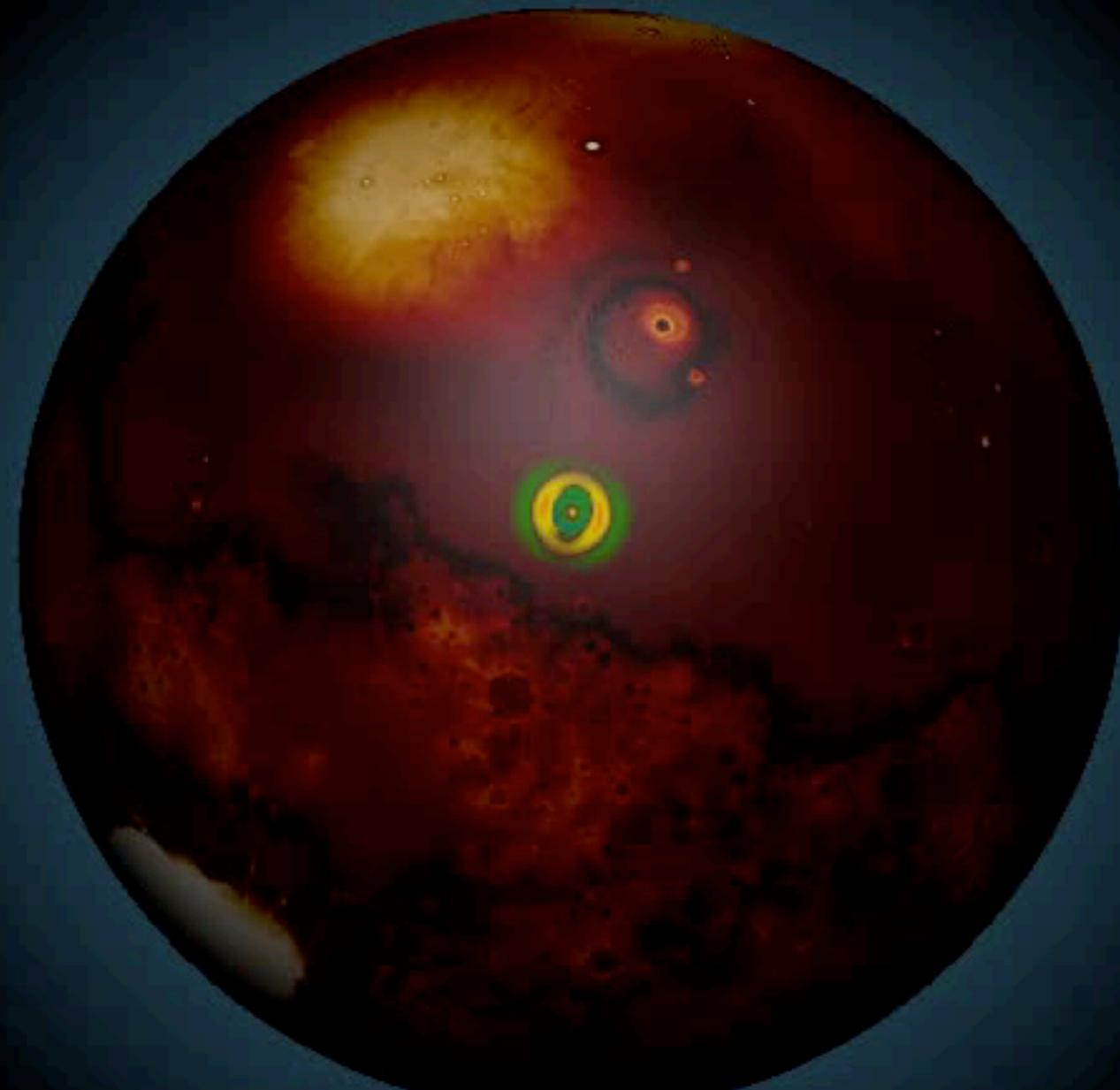


**PRINCETON  
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0:00:00

March 29, 2015 M 7.3

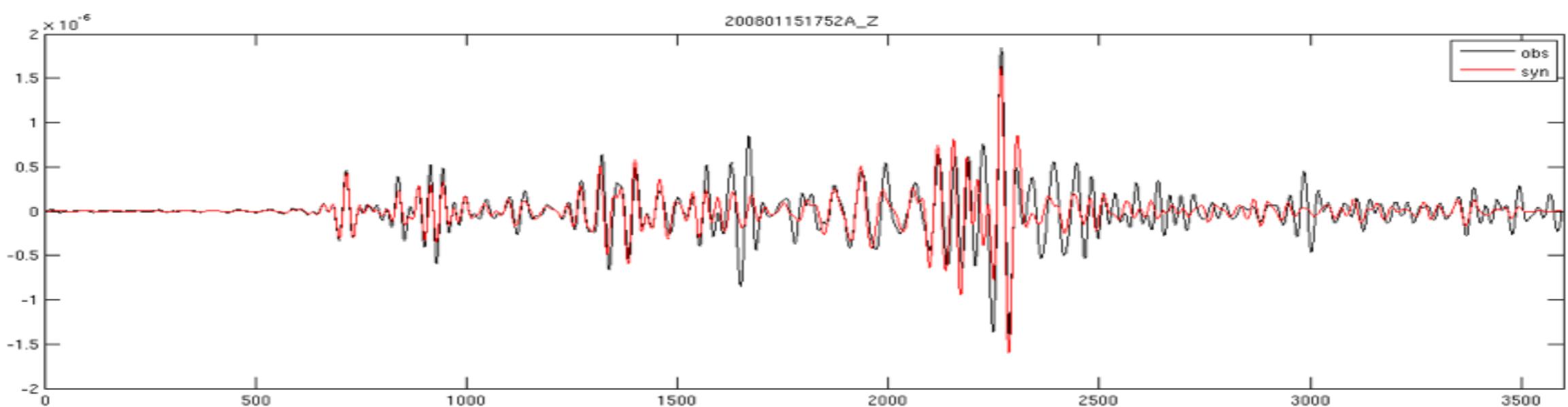
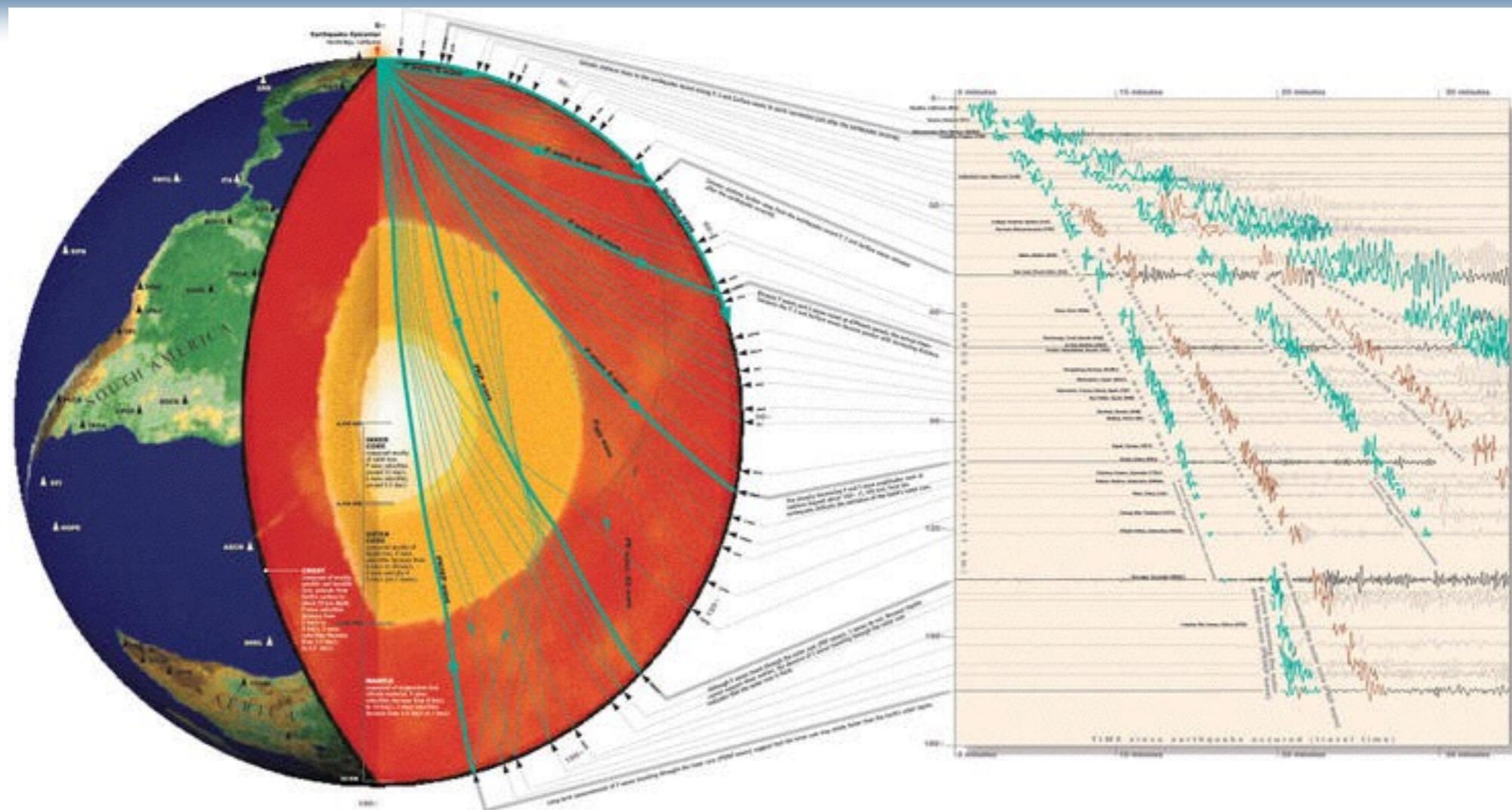
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SPECFEM3D\_GLOBE  
shakemovie by E. Bozdog, D. Peter

Mars ShakeMovie (Daniel Peter)

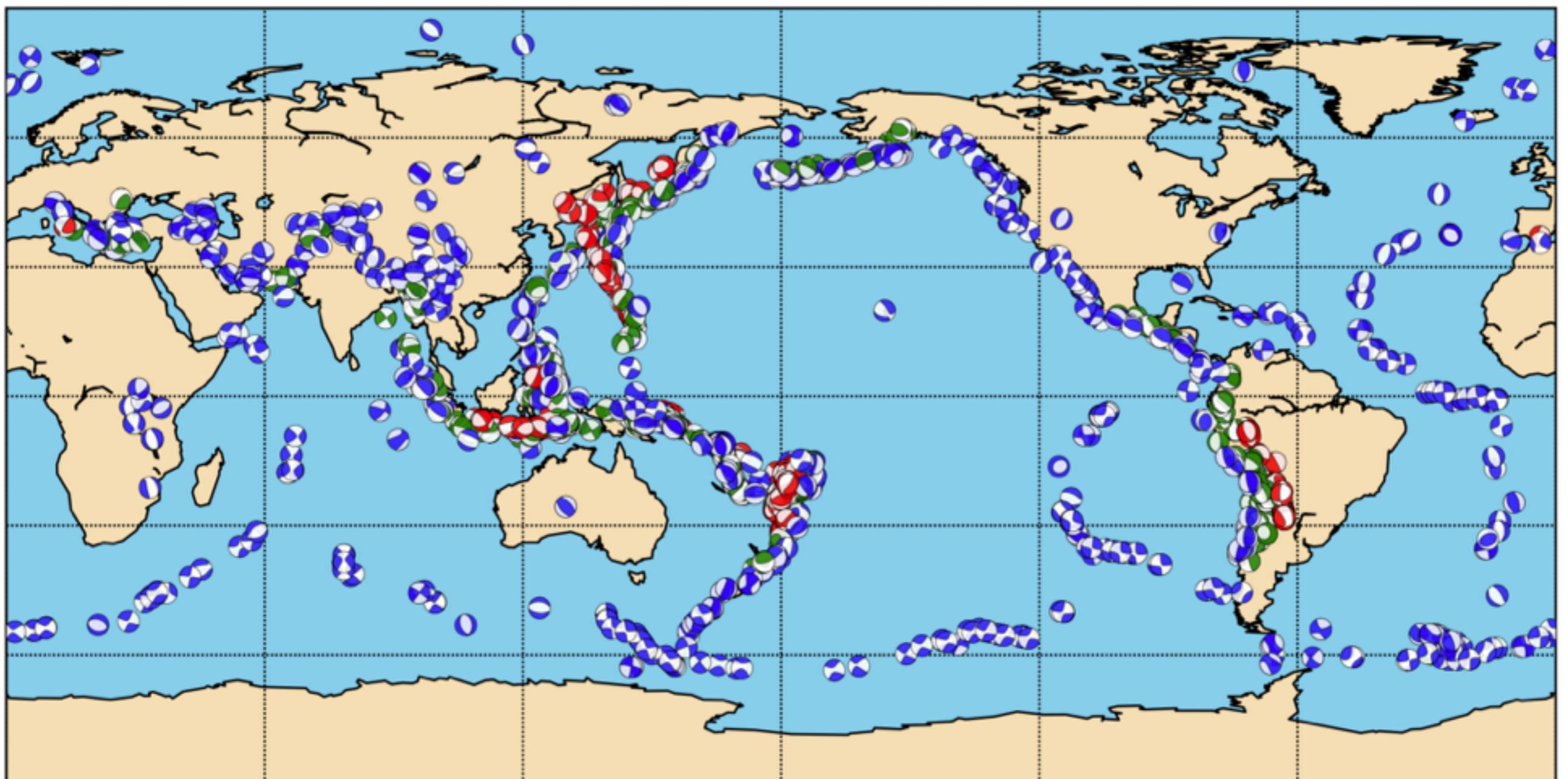
# Goal: Use Complete Seismograms



# 3D Wave Simulations & Full Waveform Inversion

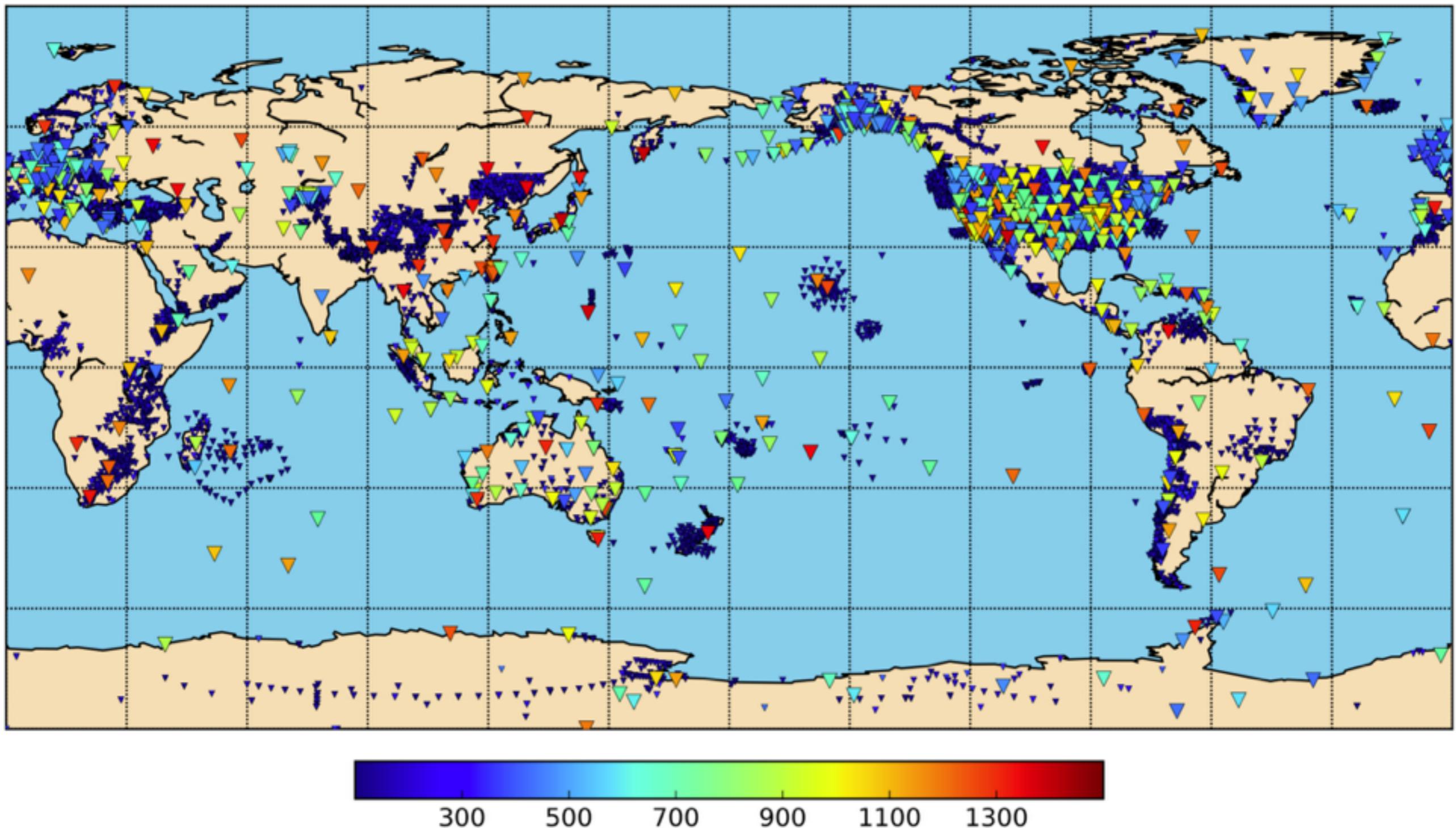
- Forward simulations and Fréchet derivative calculations in realistic 3D Earth models using *spectral-element & adjoint-state methods*
- Use anything and everything in seismograms: Full Waveform Inversion (FWI)
- Inversions for transversely isotropic  $P$  and  $S$  wavespeeds
- Invert crust and mantle together, *no crustal corrections*
- Incorporate attenuation in forward & adjoint simulations

# Global Adjoint Tomography: Earthquakes



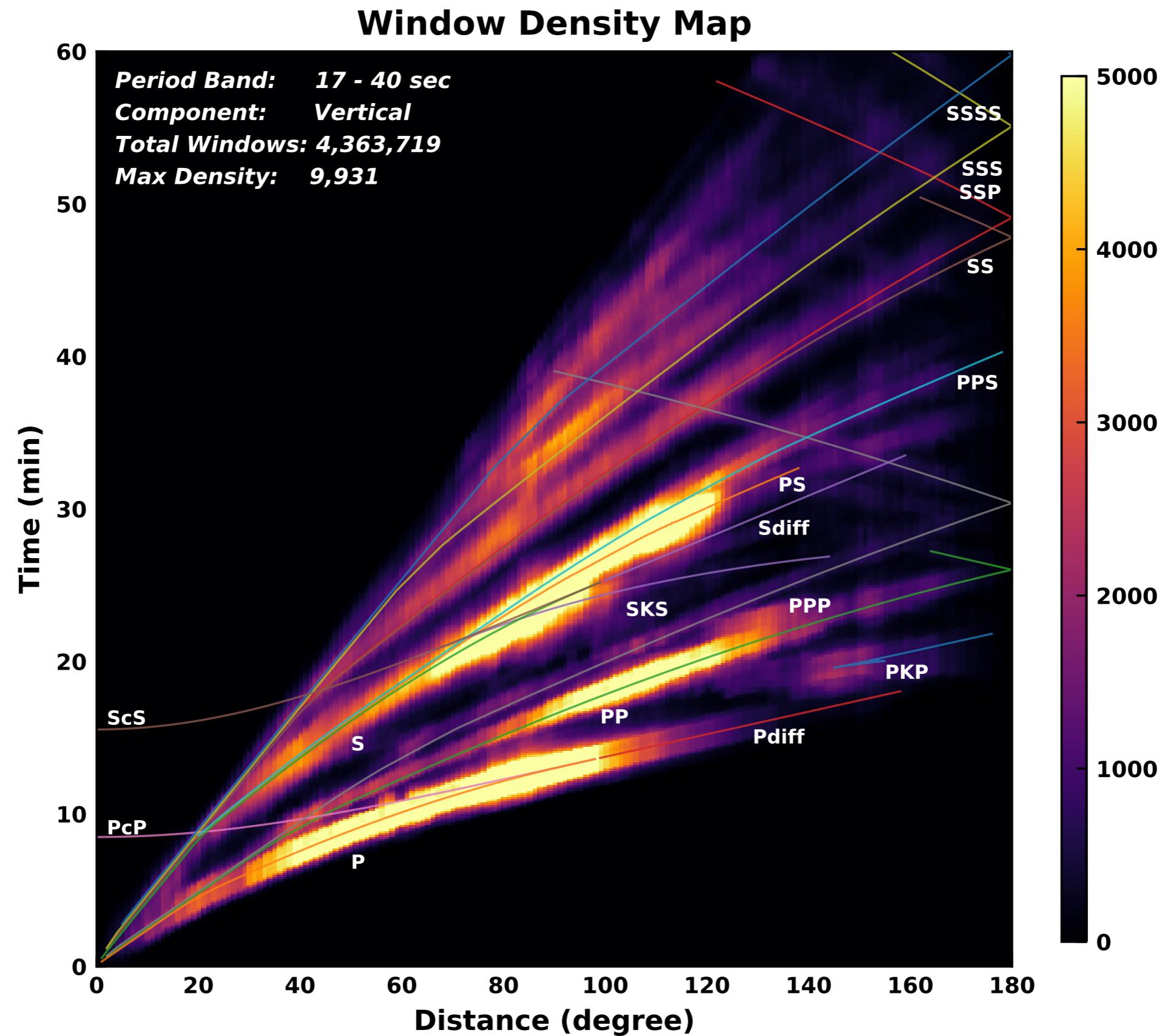
1,480 events

# Global Adjoint Tomography: Stations



11,800 permanent and temporary seismographic stations

# Window Density Map (Vertical)



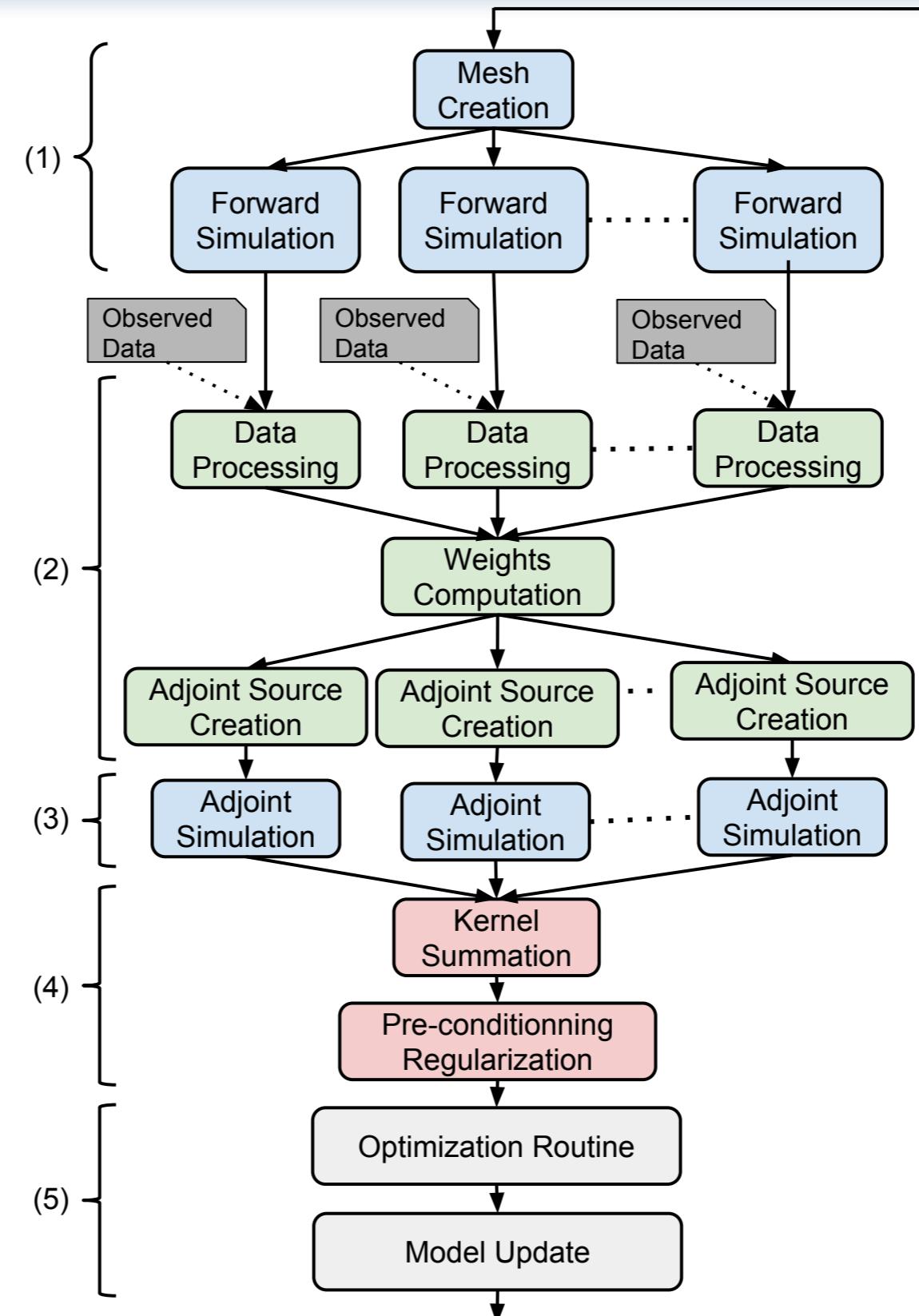
# Global Adjoint Tomography Workflow

Challenge#1 Data Volume

8 million 120-min 20 Hz  
seismograms (6 TB)

10 TB kernels

1 PB wavefield files



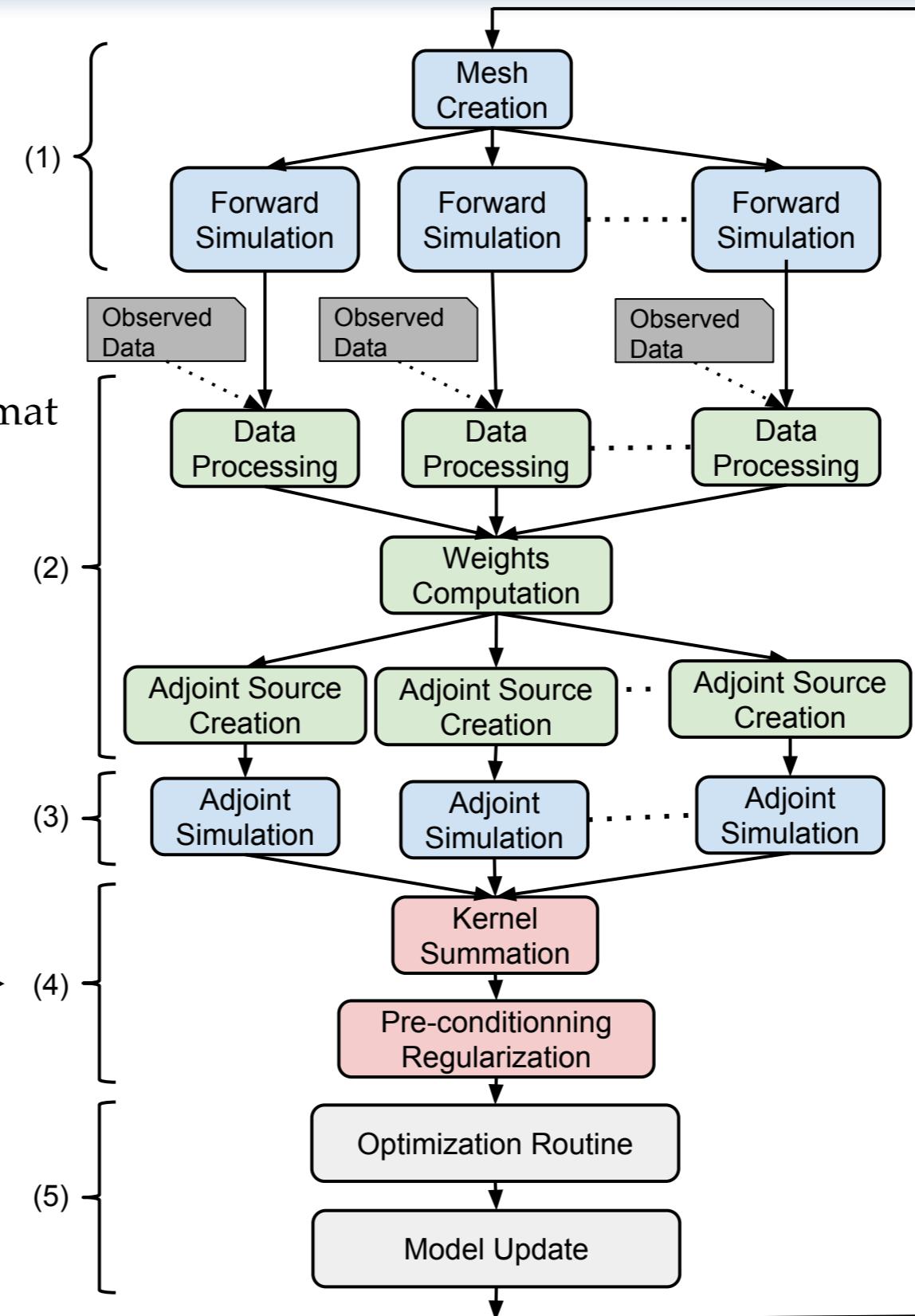
# Global Adjoint Tomography Workflow

## Challenge#1 Data Volume

Adaptable Seismic Data Format  
ASDF (Krischer et al. 2016)

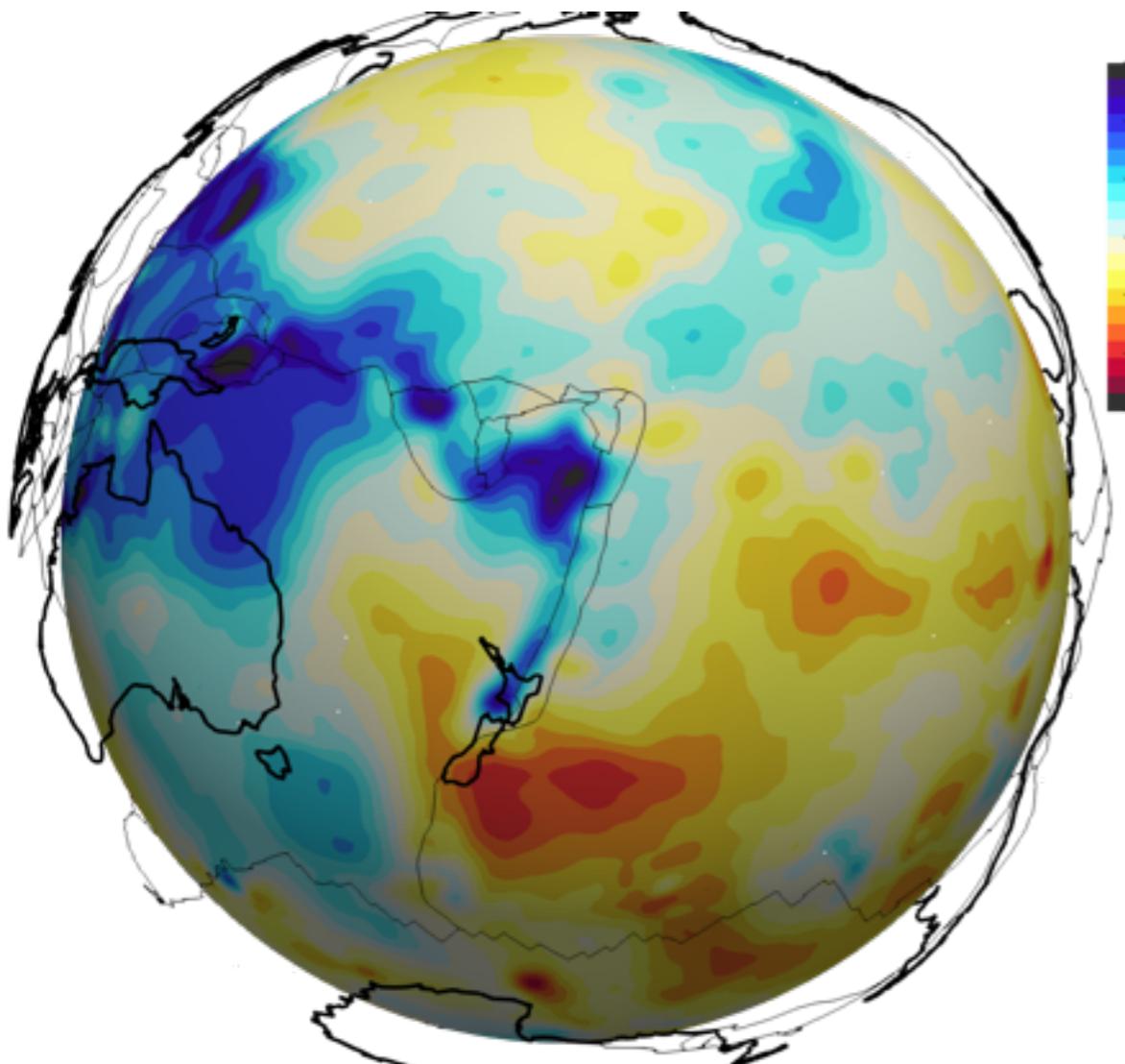


Adaptable I/O System  
ADIOS (Liu et al. 2014)

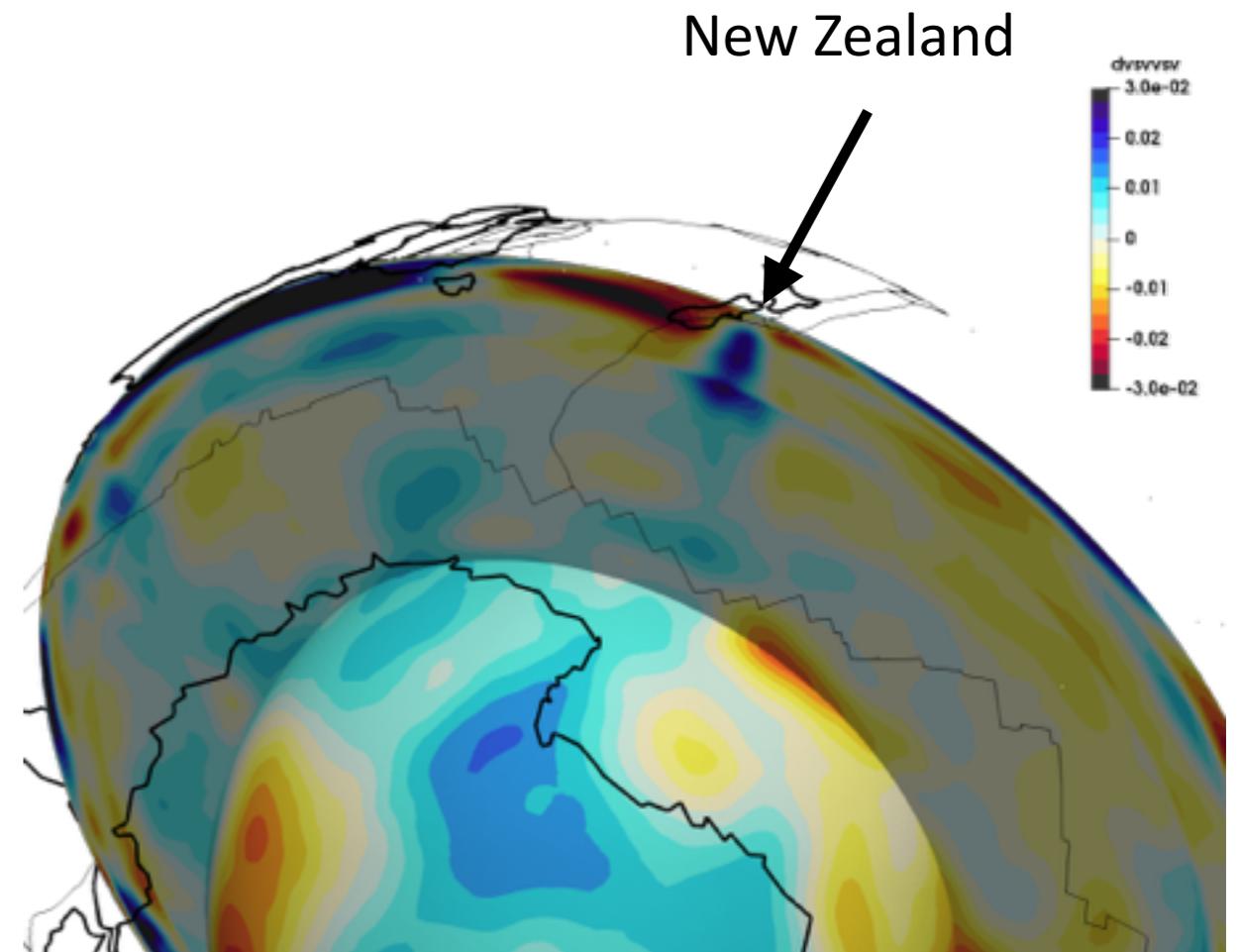


# Model GLAD-M25

## Fiji Subduction 440 km



dsvvvsv  
-3.0e-02  
-0.02  
-0.01  
0  
0.01  
0.02  
3.0e-02

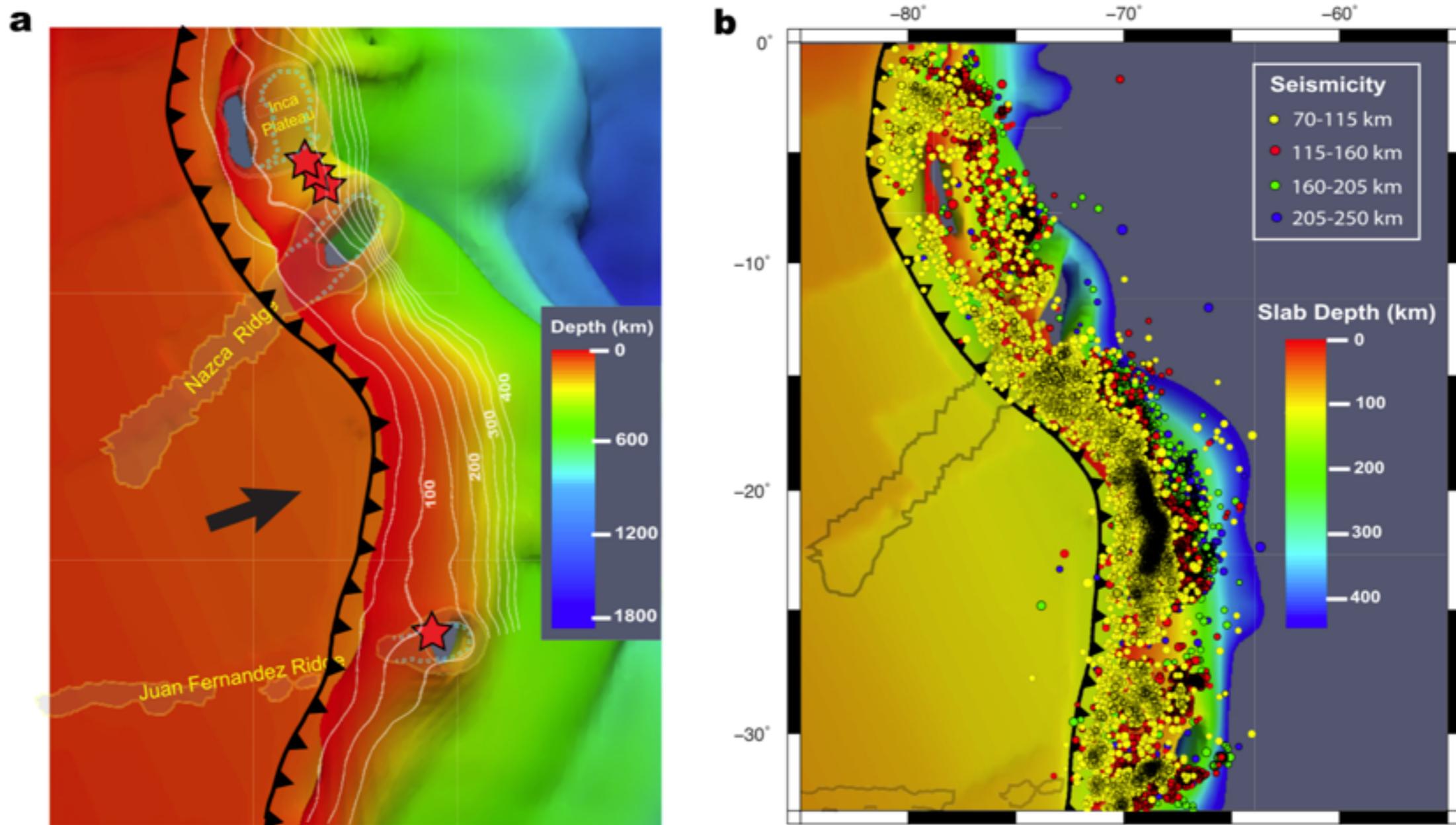


New Zealand

dsvvvsv  
3.0e-02  
0.02  
0.01  
0  
-0.01  
-0.02  
-3.0e-02

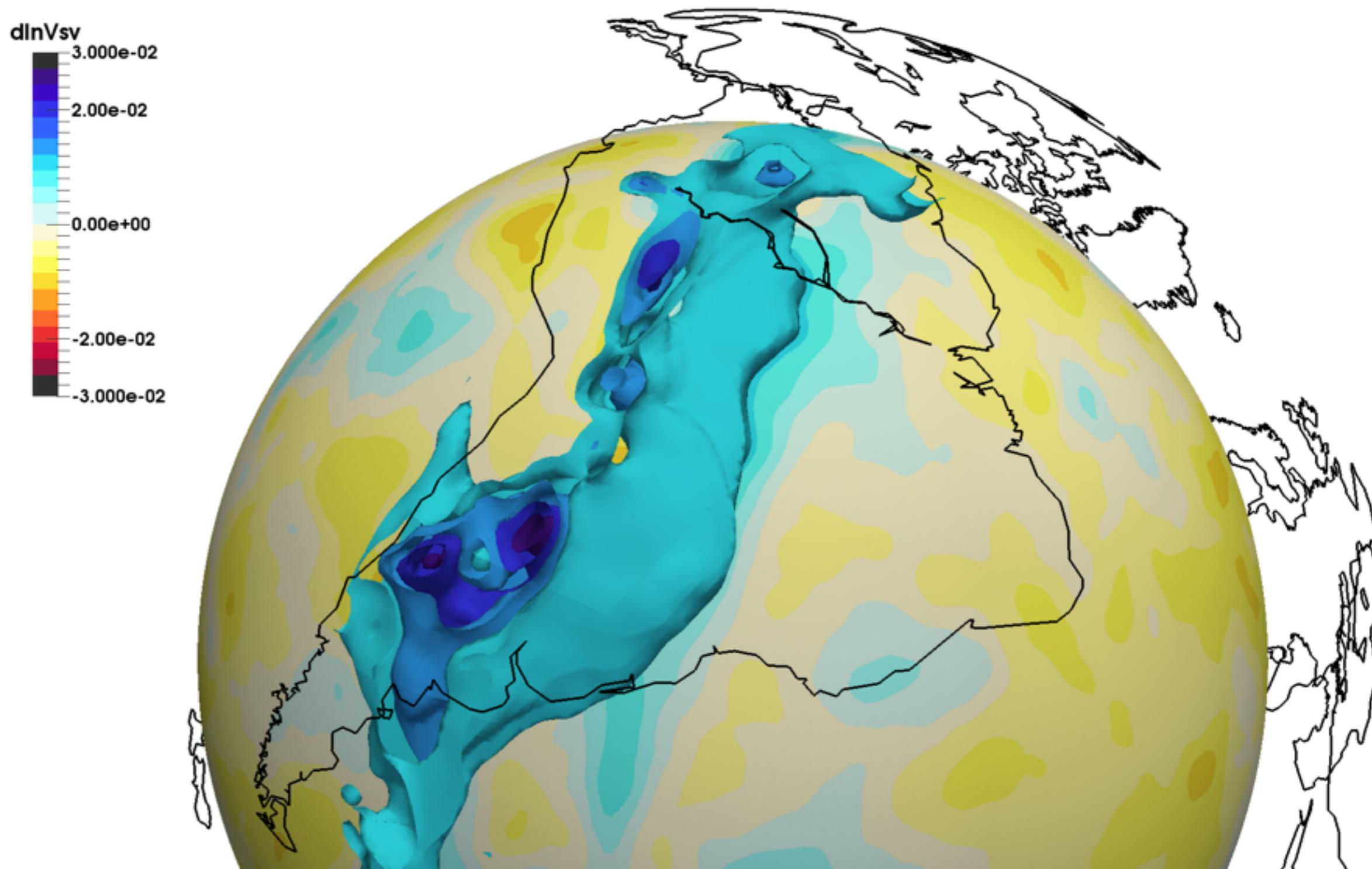
# Subduction Zones

# GLAD-M25 South America

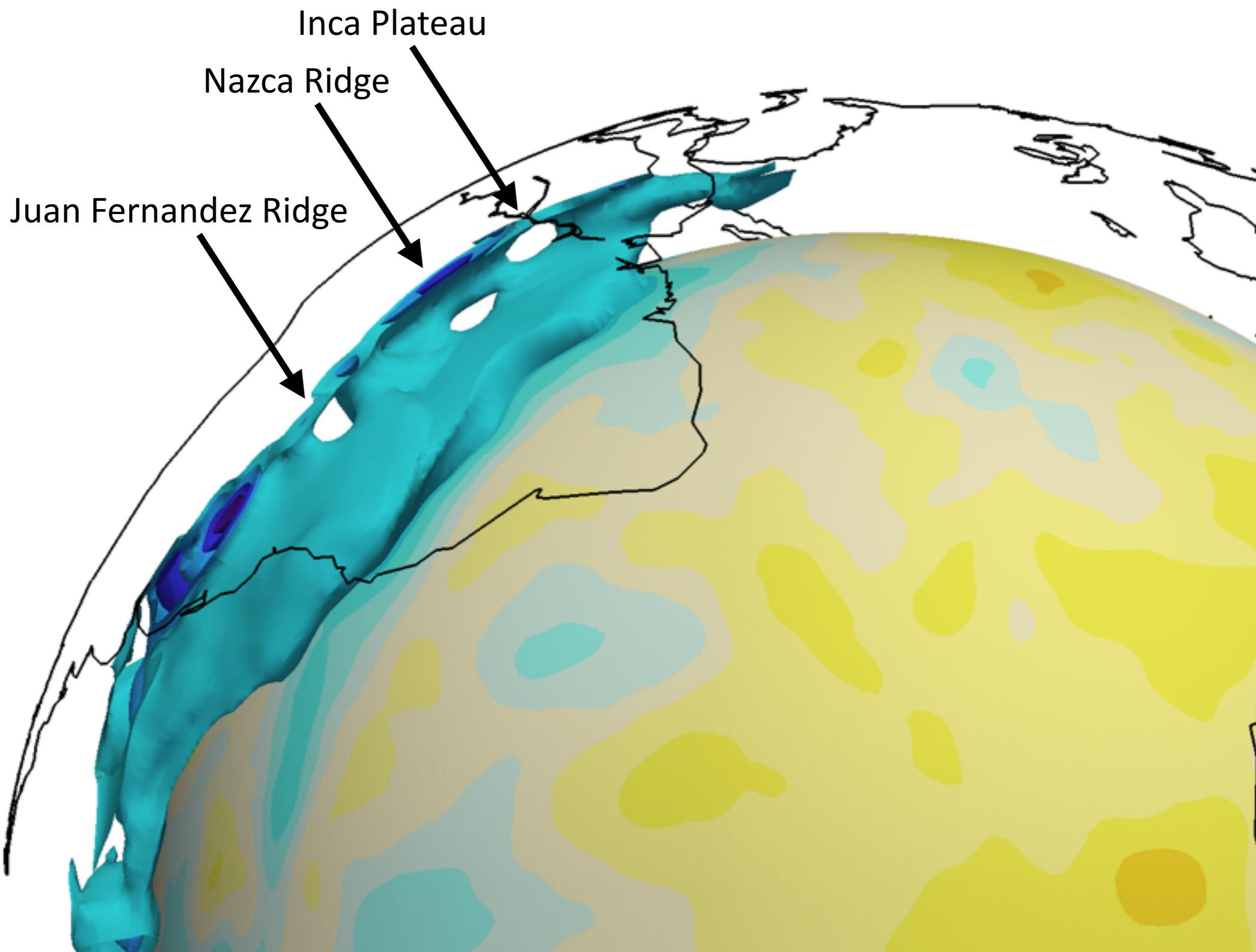


**Fig. 5.** 3-D geometry of the predicted present-day slab beneath South America and that of the Nazca Plate west of the trench (outlined using an isotherm of 300°C cooler than the ambient mantle). a) 3D aerial view of the subducting Nazca Plate (temperature isosurface), with colors representing the depth of the slab's upper surface on the right side of the trench and depth of the plate's lower surface on the left side. The slab tears are illustrated with both the isosurface of temperature and the evolution of buoyancy features (translucent gray areas). Thin white lines are the interpolated Benioff zones from Hayes et al. (2012). Dashed lines within the subducting buoyancy features outline their original intact geometry. Red stars indicate the locations of adakitic eruptions. b) Map-view comparison of the slab geometry with the distribution of intermediate-depth seismicity ( $M_b > 3.0$  from ISC seismic catalog). (For interpretation of the references to color in this figure legend, the reader is referred to the web version of this article.)

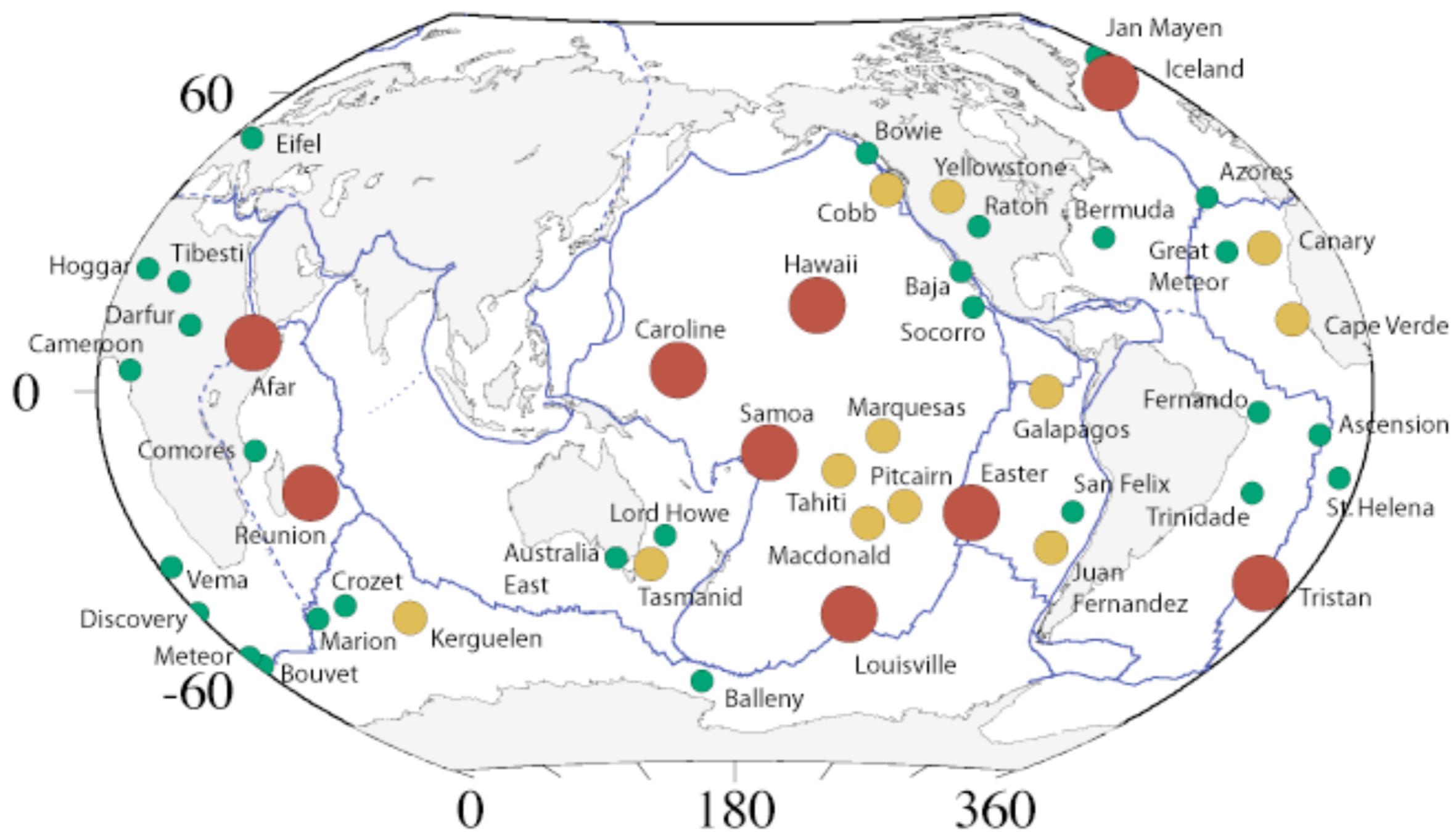
# Model GLAD-M25



# Model GLAD-M25

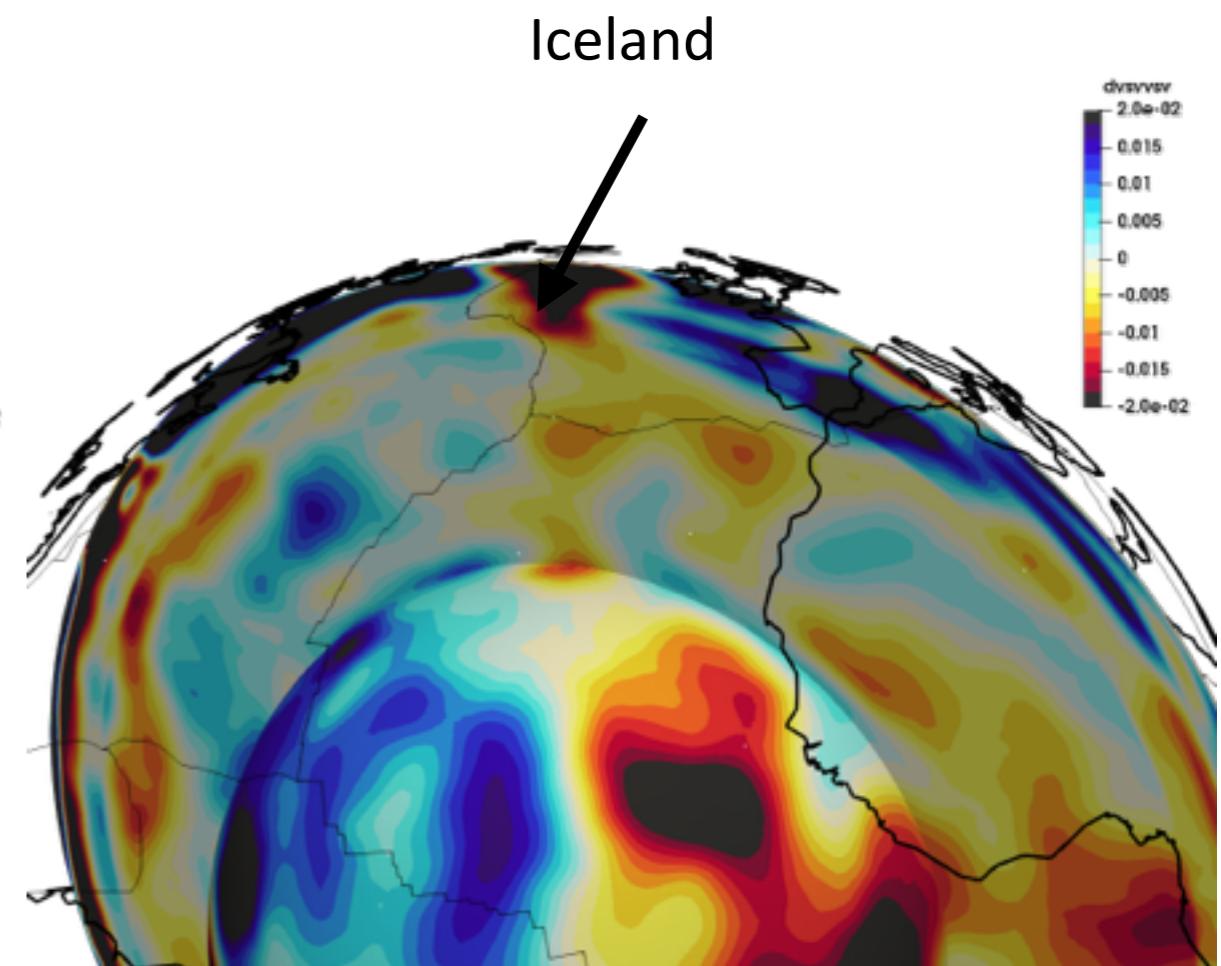
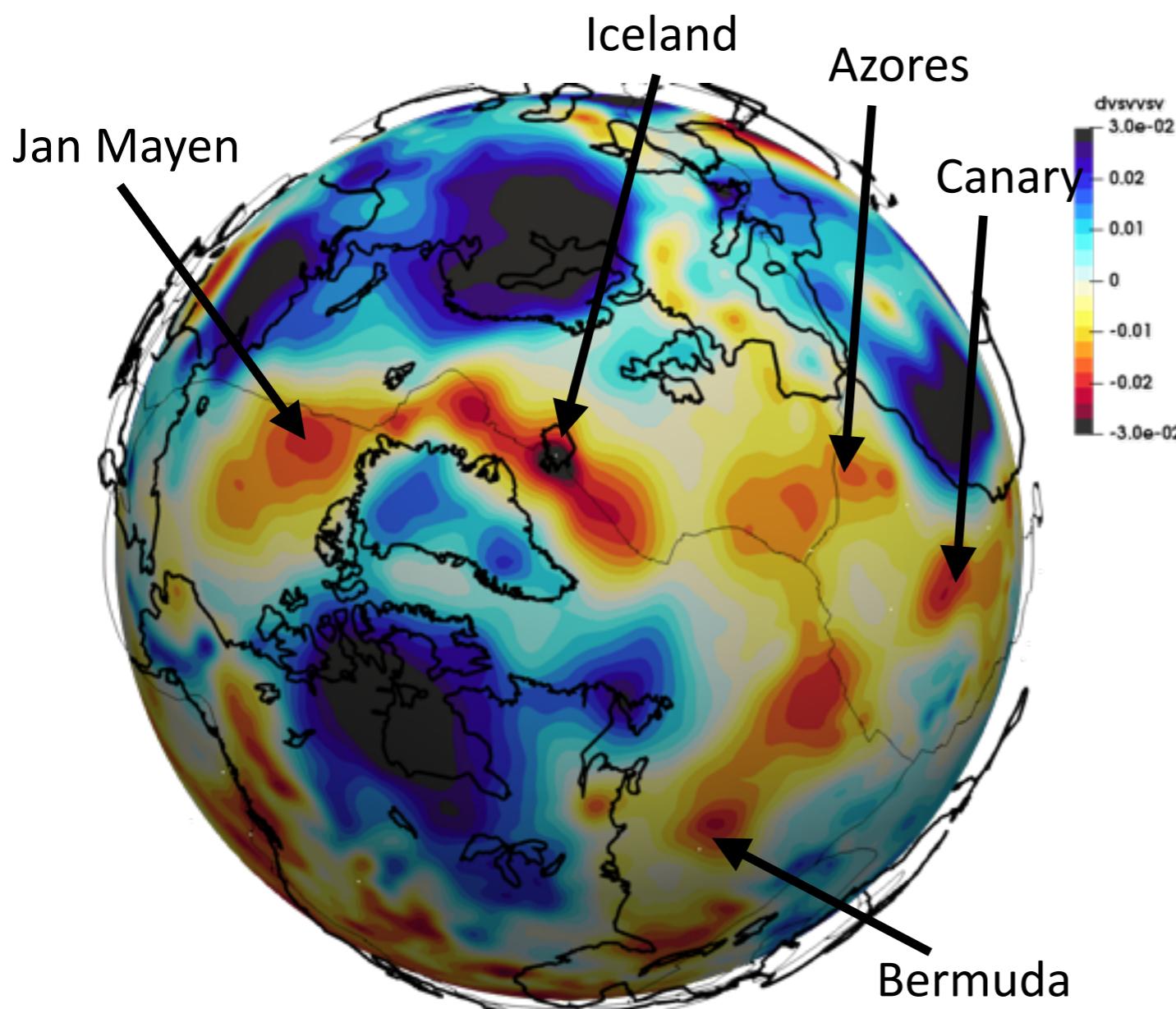


# Hotspots & Mantle Plumes



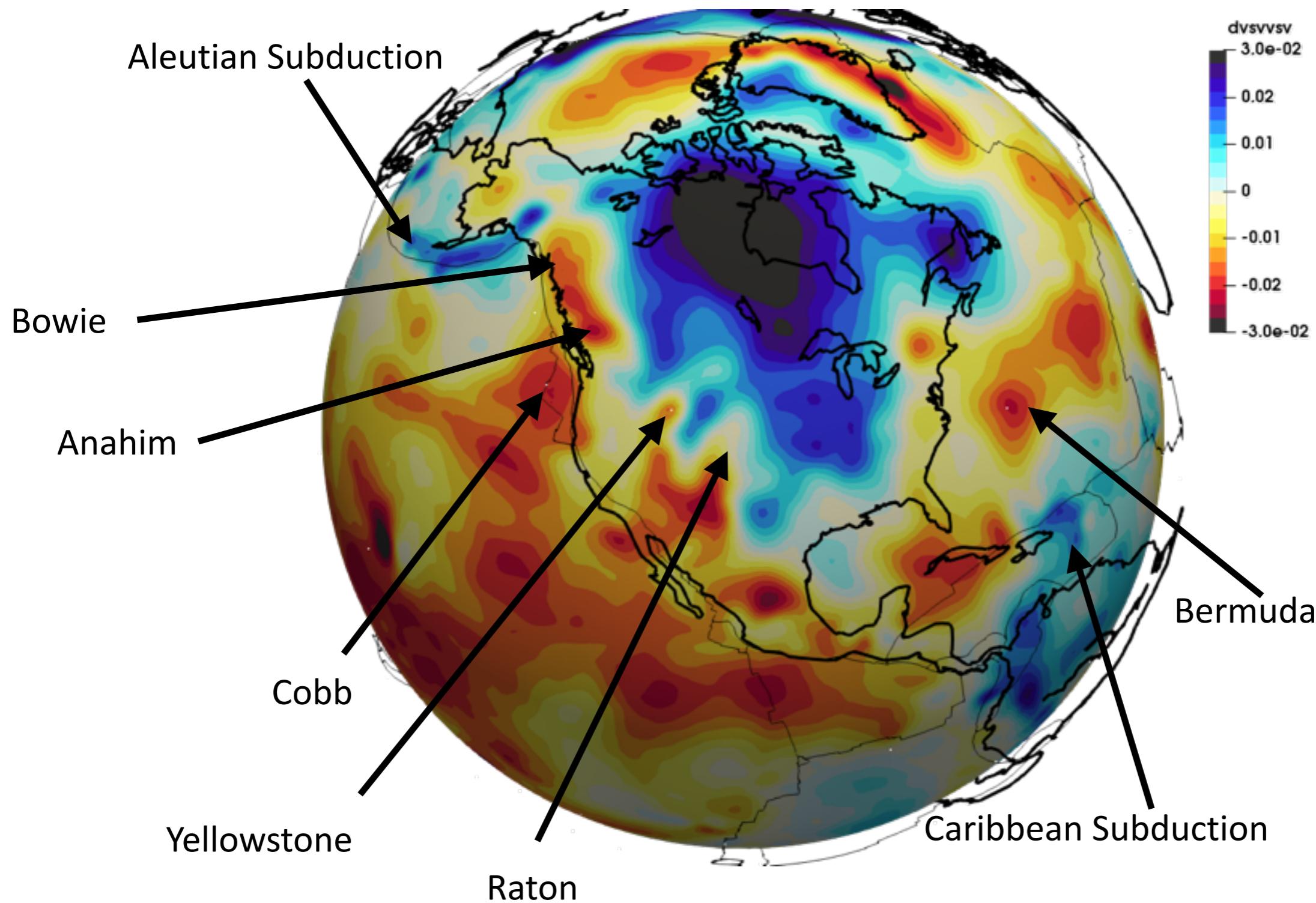
# Model GLAD-M25

## Iceland Hotspot 250 km



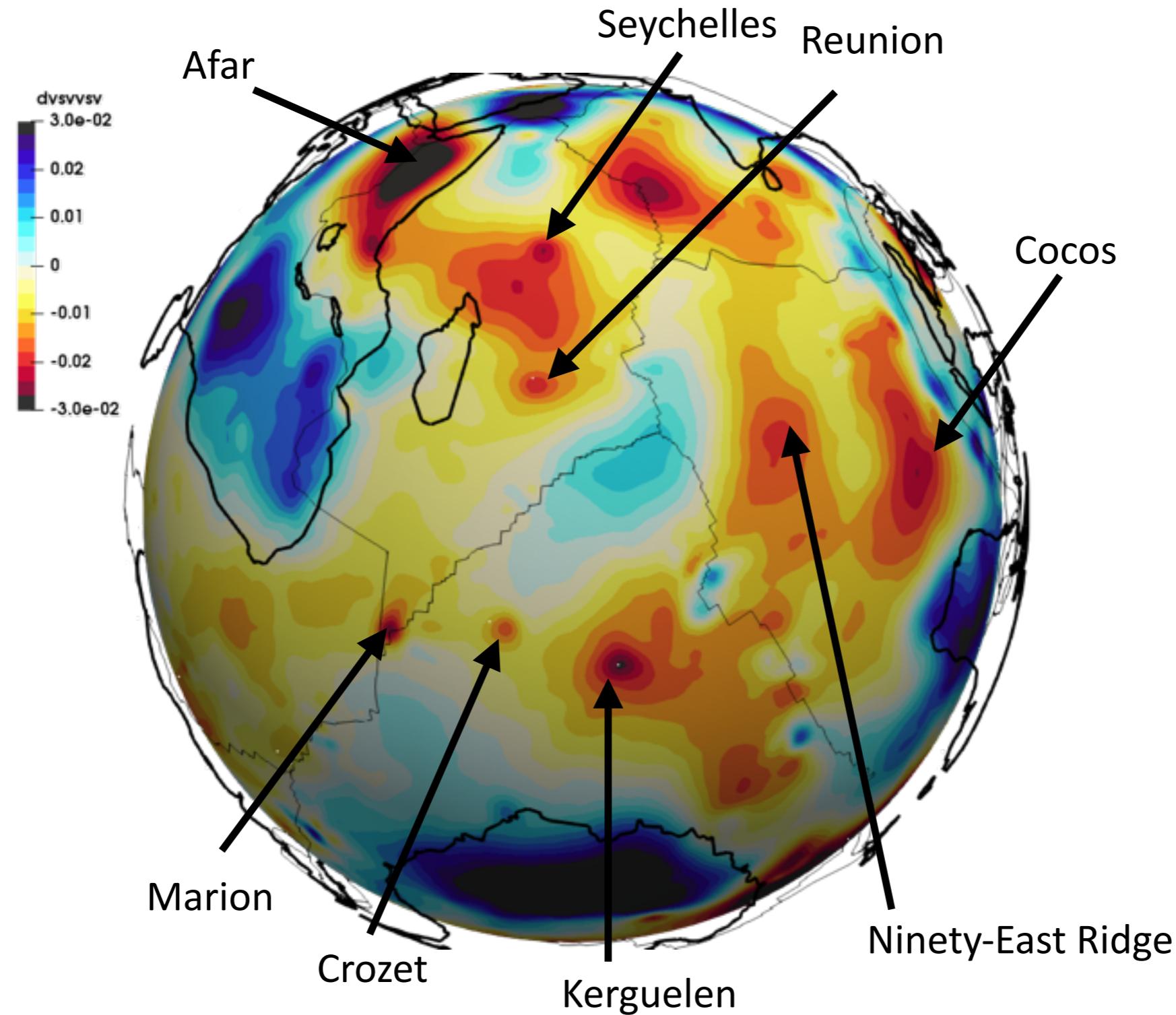
# Model GLAD-M25

North America at 250 km



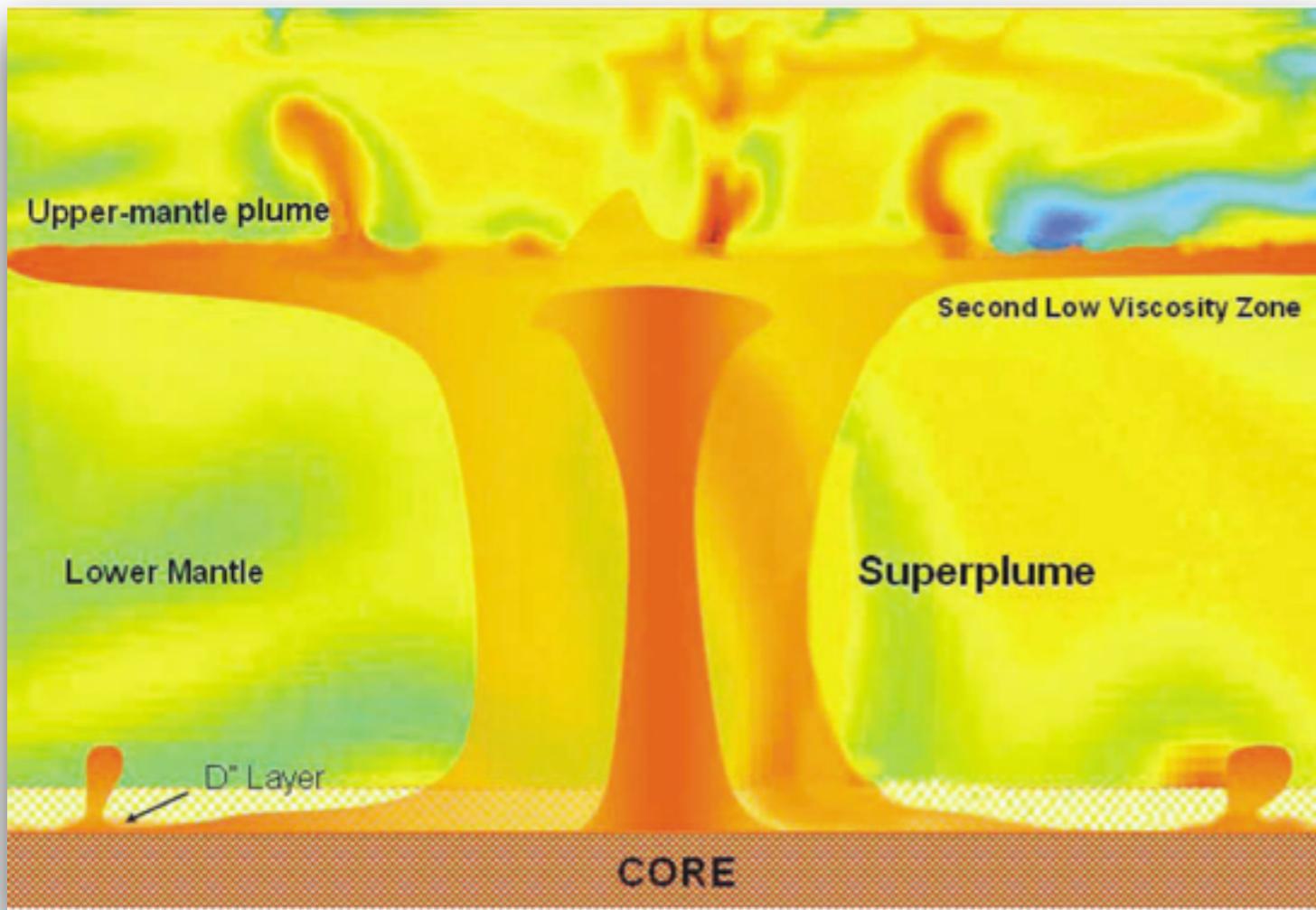
# Model GLAD-M25

## Indian Ocean at 250 Km



# Multi-Scale Mantle Plumes

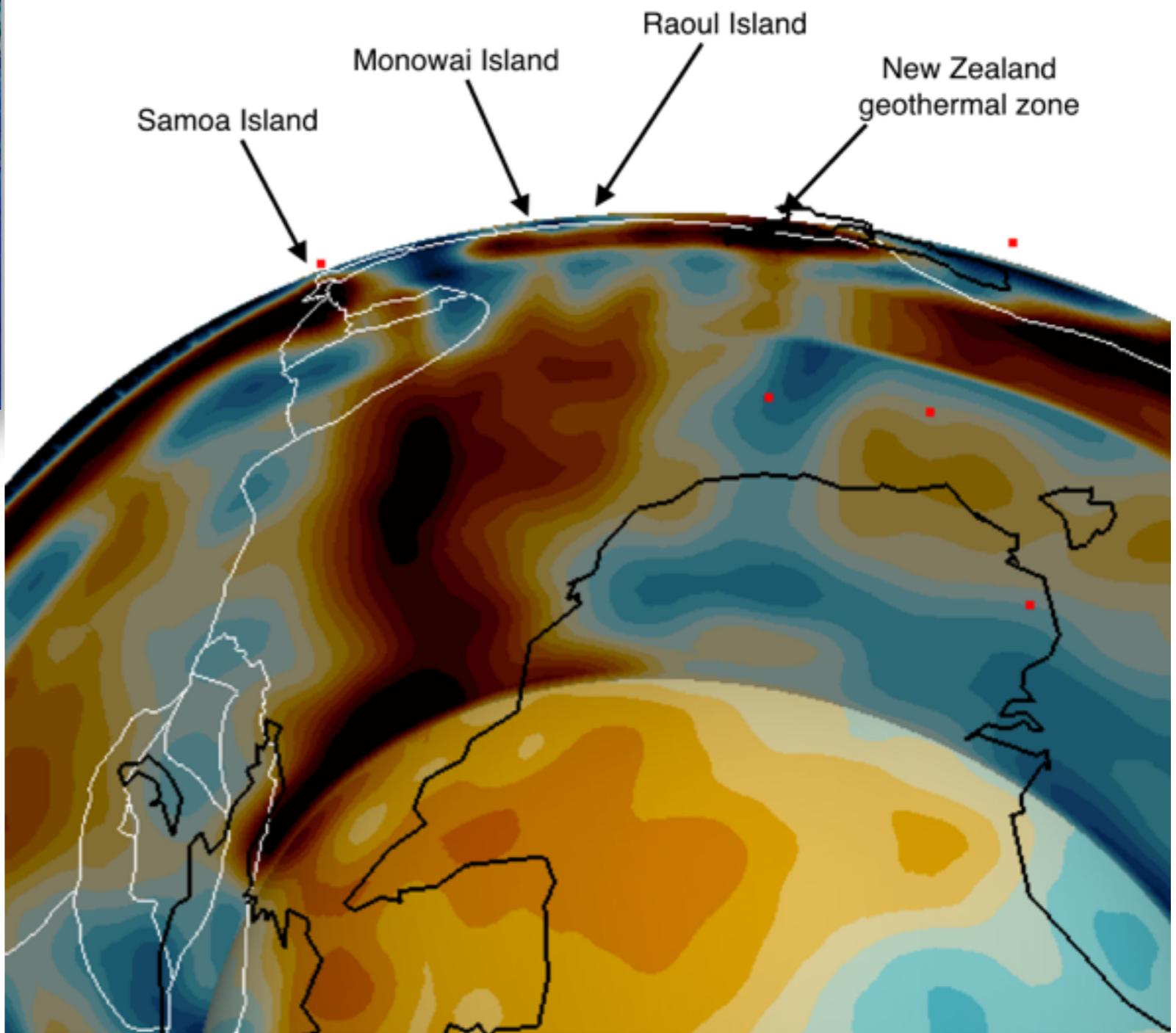
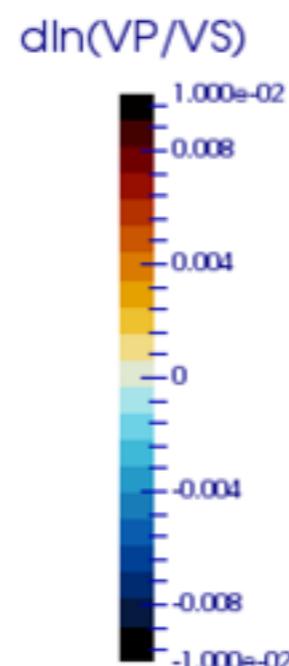
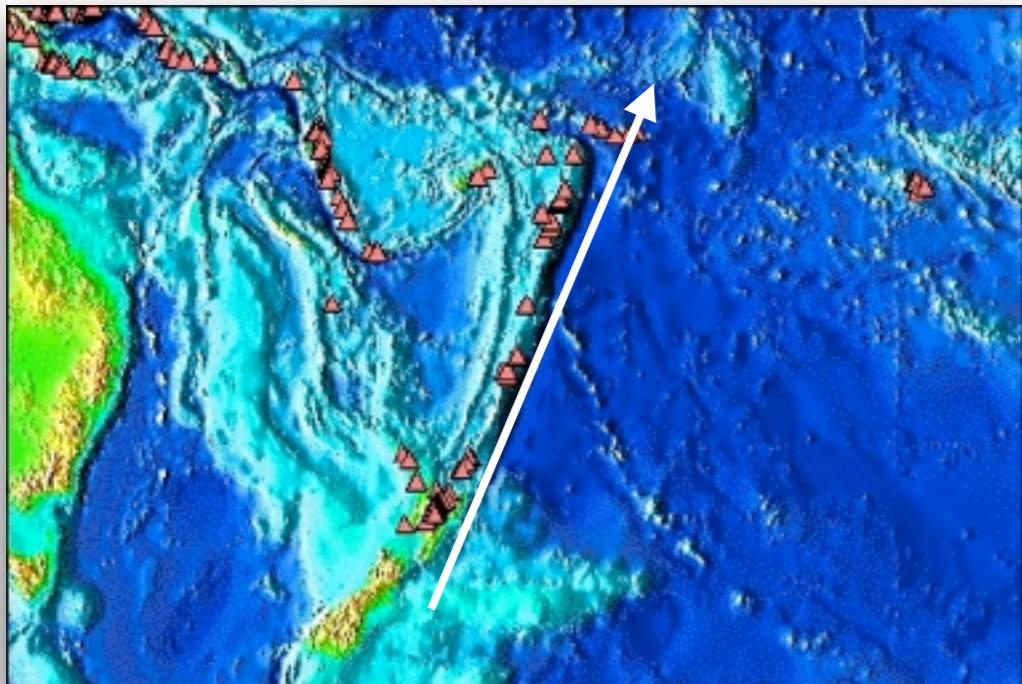
Stable lower-mantle plumes followed by small upper-mantle plumes: primary & secondary plumes



Controlled by:

- mantle viscosity
- thermal conductivity
- thermal expansivity
- phase transitions

# Model GLAD-M25



# Pillars of the Mantle II

## Imaging Earth's Interior with Adjoint Tomography



OAK RIDGE  
LEADERSHIP  
COMPUTING FACILITY



COLORADO SCHOOL OF MINES  
EARTH • ENERGY • ENVIRONMENT

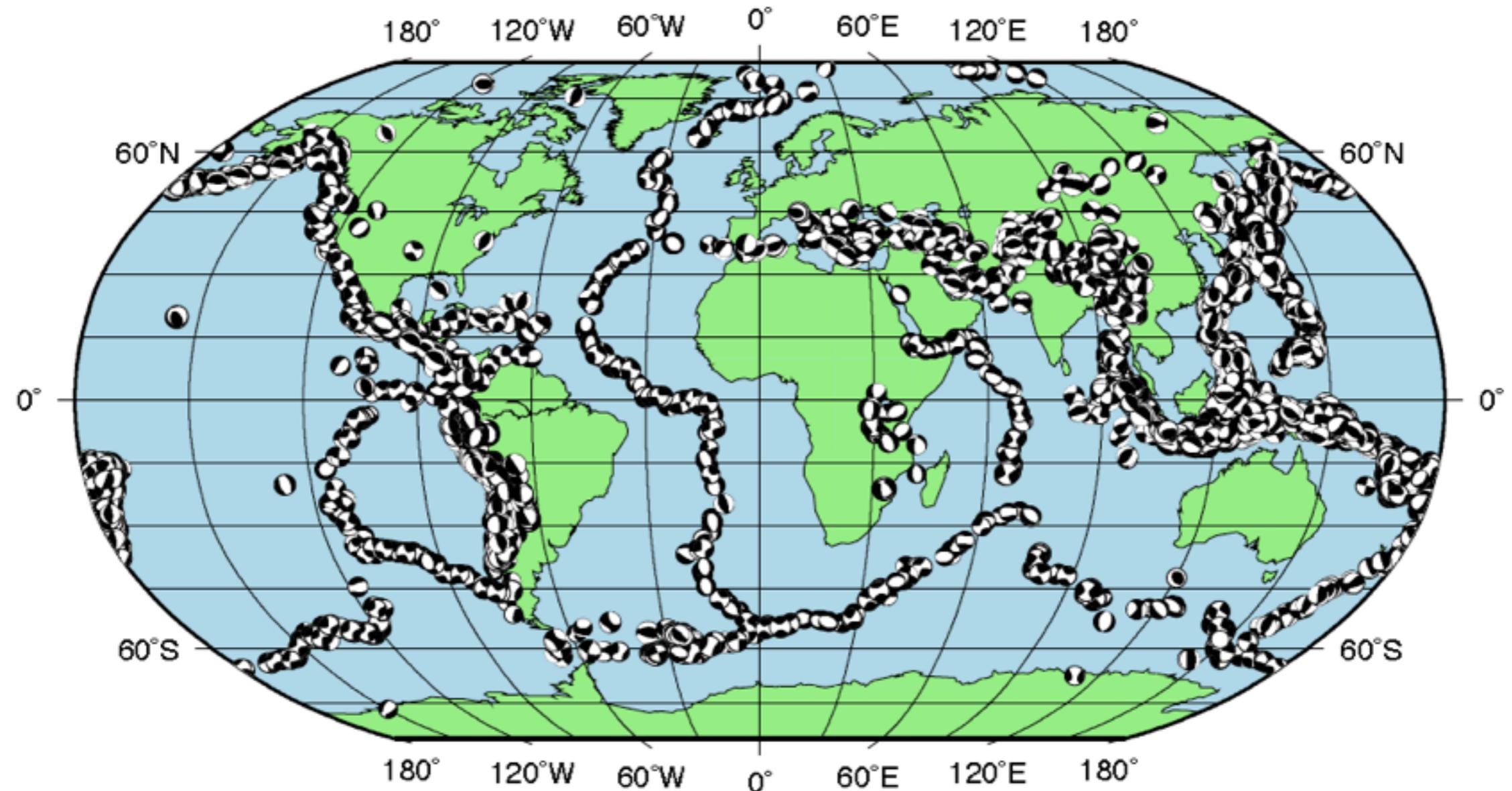


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# Exascale Goal: Use All Available Data

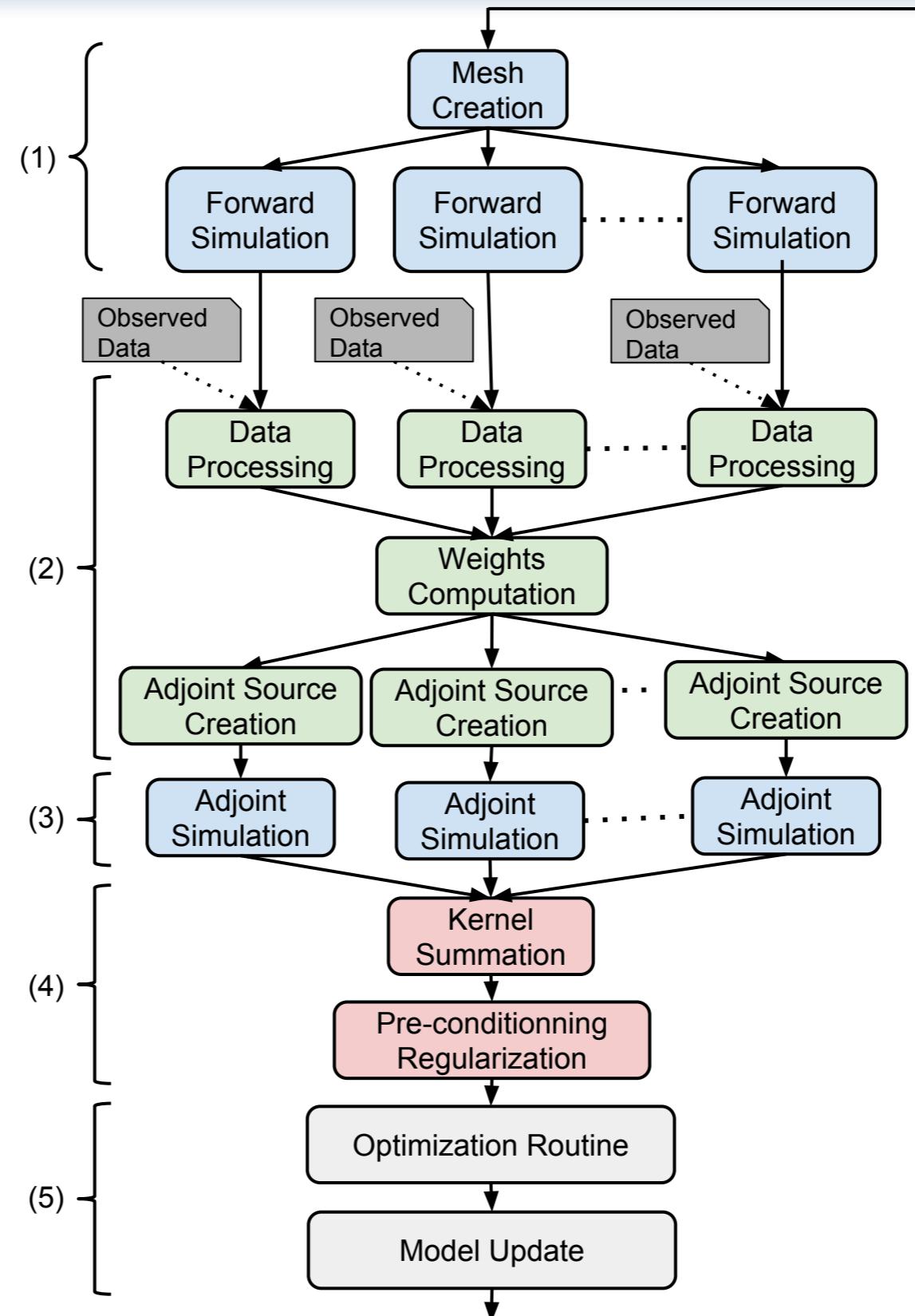


More than 6,000 earthquakes ( $5.5 \leq M_w \leq 7.0$ ) since 1999

# Global Adjoint Tomography Workflow

**Challenge #2**  
**Expensive Simulations**  
&  
**Complex Workflow**

**0.1 million core hours**  
for data processing

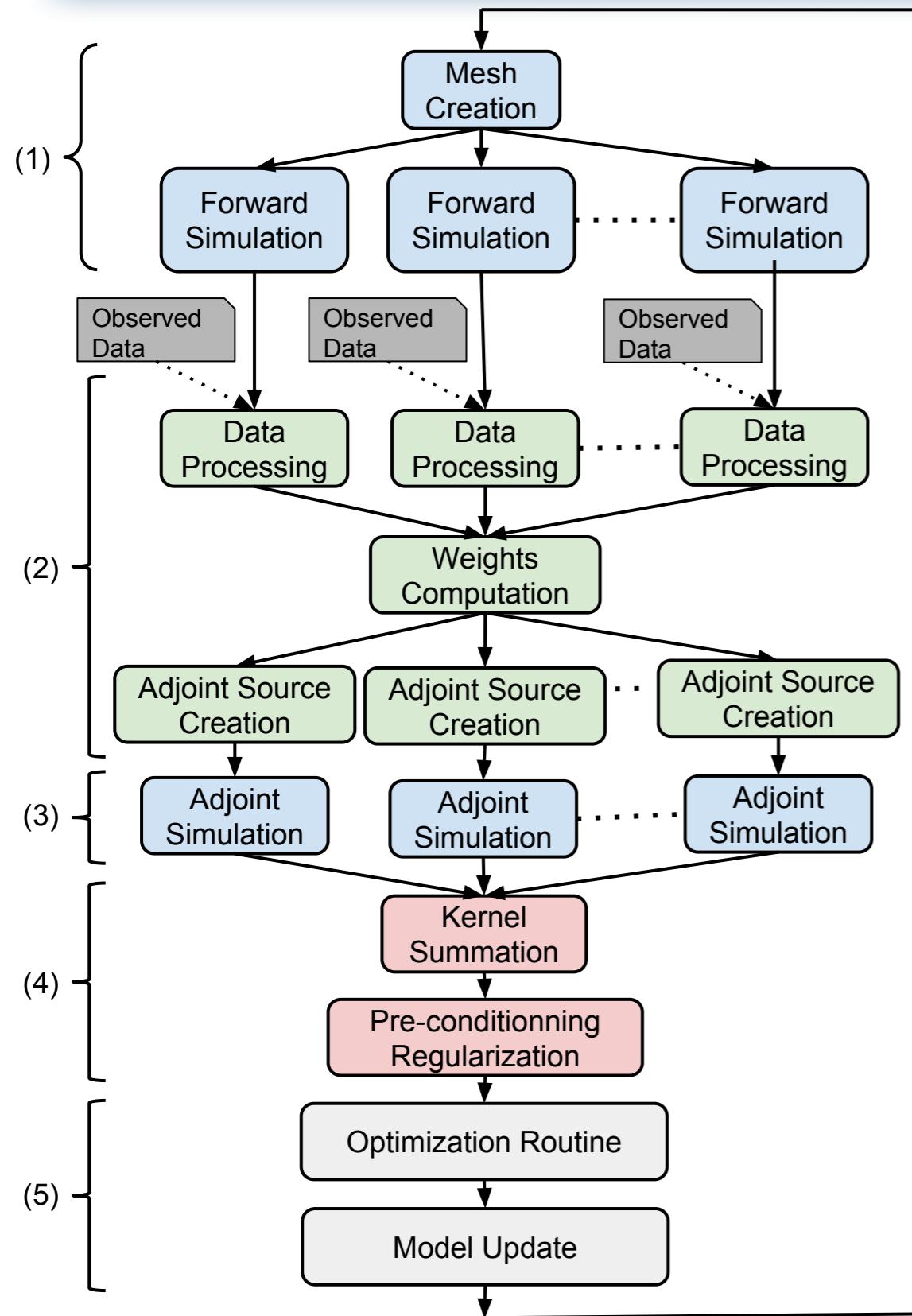


**3 million core hours**  
for forward simulation

**6 million core hours**  
for adjoint simulation

**1 million core hours**  
for line search

# Global Adjoint Tomography Workflow Management



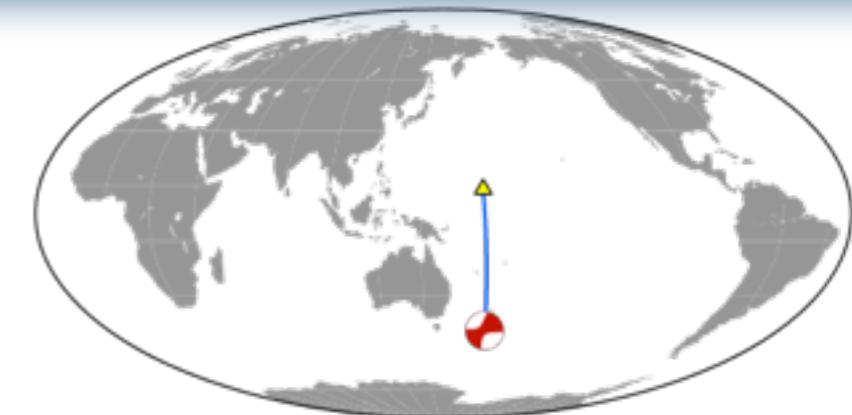
Main sources of trouble:

- Hardware failures
- Human errors

We are implementing the RADICAL EnTK workflow management toolkit:

- **Automation:** save time & human effort for repeated tasks
- **Efficiency:** acceleration, taking full advantage of HPC systems
- **Fault tolerance:** automated job failure detection & recovery

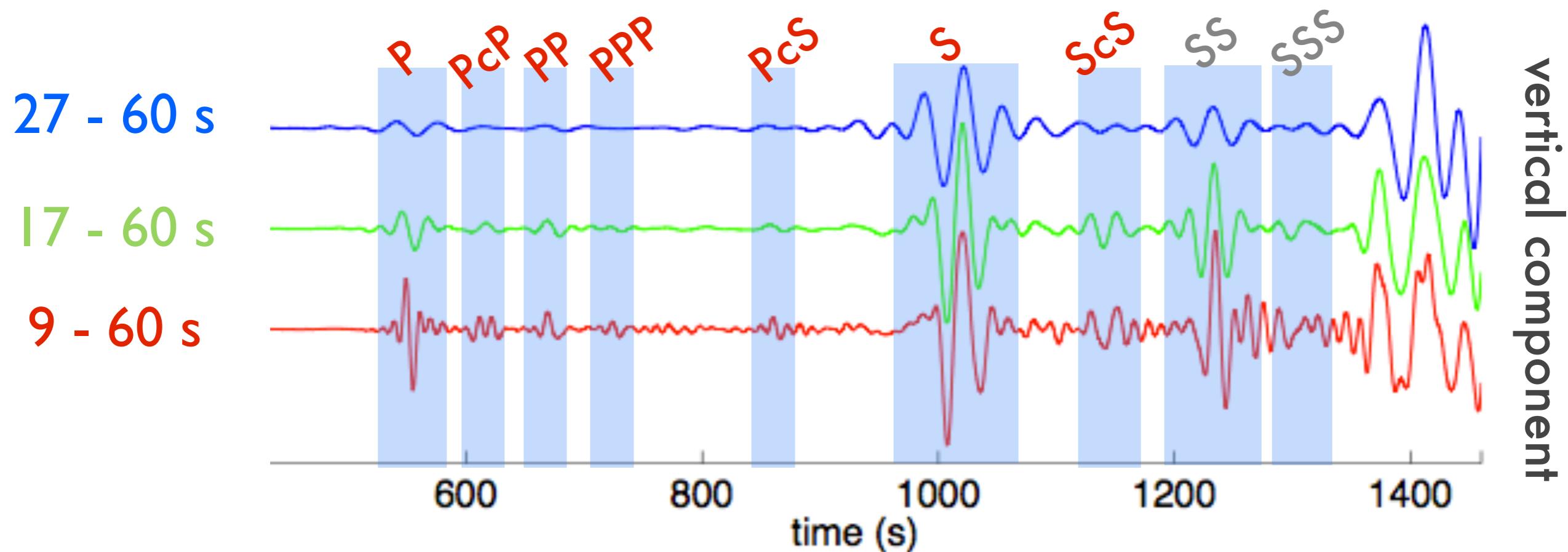
# Exascale Goal: Higher-Frequency Body Waves



Short term goal (2018): 9 s ("Summit")

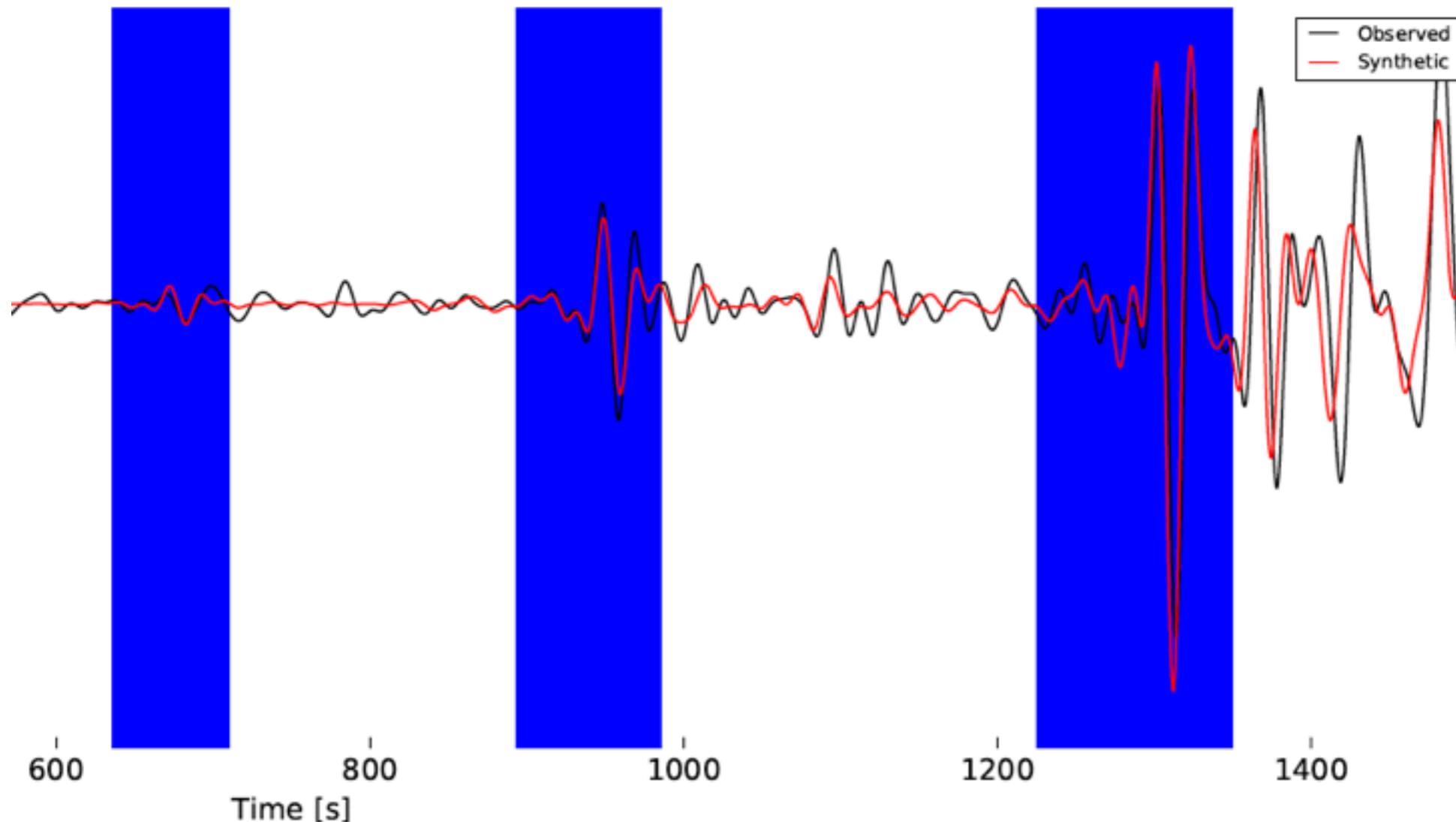
Long term goal (2021): 1 s (exascale)

Station: KWAJ  
 $\Delta = 52^\circ$



# Machine Learning for Data Assimilation

Use of Machine Learning for automated window selection



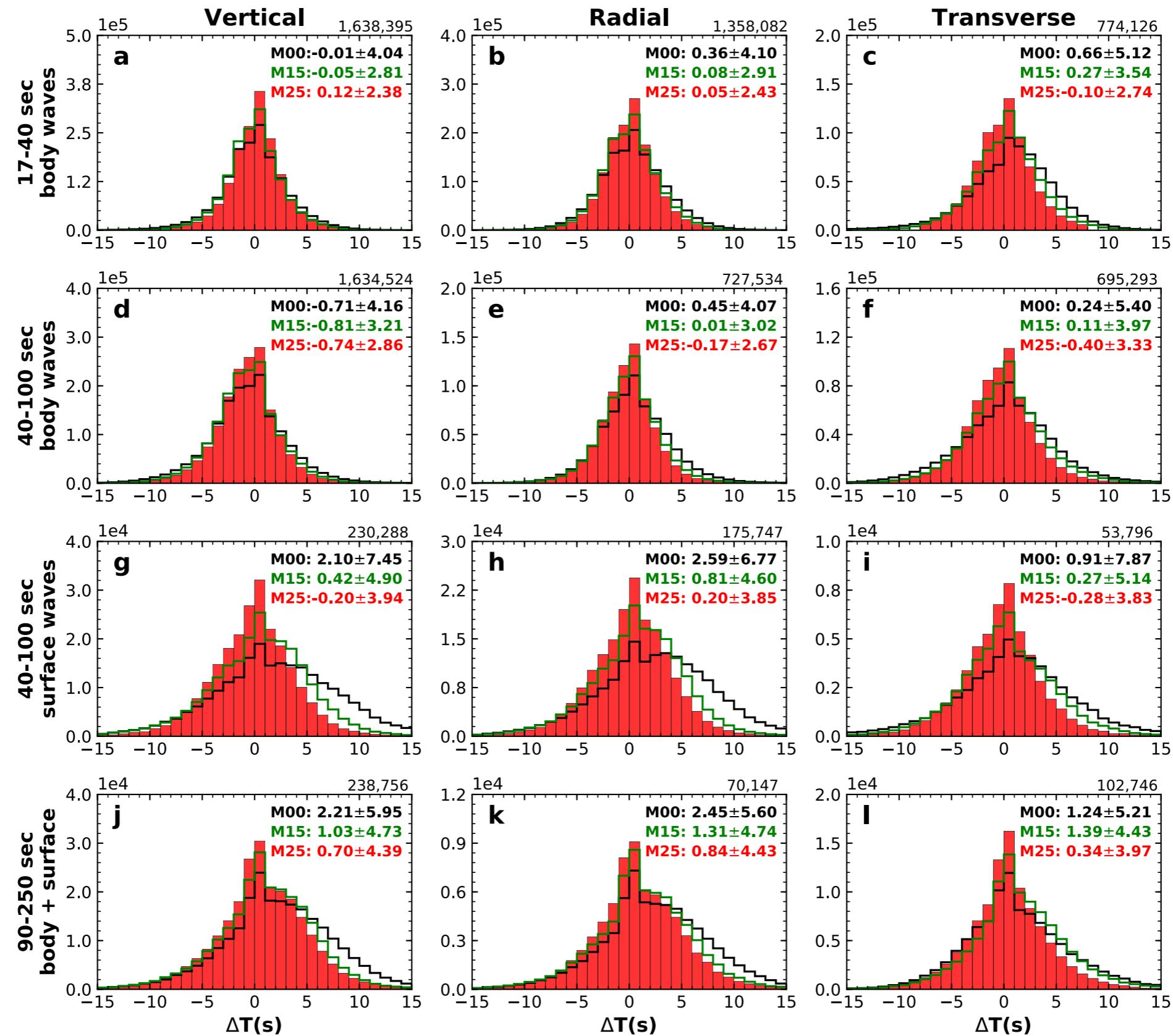
Center for Accelerated Application Readiness (CAAR) project in preparation for ORNL's next machine "Summit"

# Summit Seismology Science Goals

- Use data with a shortest period of  $\sim 1$  Hz
- Use all available events with magnitudes greater than  $\sim 5.5$
- Use entire 200 minutes long, three-component seismograms
- Workflow stabilization & management
- Allow for transverse isotropy with a random symmetry axis
- Allow for variations in attenuation
- Facilitate uncertainty quantification
- Source encoding to reduce the cost of the gradient calculation
- Opportunities for ML / AI in data selection & assimilation
- Data mining, feature extraction & visualization



# Held-Out Dataset



# Held-Out Dataset

	Vertical (%)	Radial (%)	Transverse (%)
17–40 s	11.8 (29.2)	14.1 (33.7)	21.5 (43.4)
40–100 s body waves	14.5 (26.2)	12.9 (32.2)	16.9 (39.0)
40–100 s surface waves	29.3 (49.1)	28.1 (49.4)	23.7 (51.2)
90–250 s	10.9 (30.9)	14.3 (34.8)	24.0 (34.9)

Table 2: Changes in fit for 360 earthquakes not used in the inversion in the twelve measurement categories between the new model, GLAD-M25, and its starting model, GLAD-M15, and, in parentheses, between GLAD-M25 and model S362ANI combined with CRUST2.0, which was the starting model for the GLAD-M15 inversion.