

# **SALSA3D - A Global 3D P-Velocity Model of the Earth's Mantle For Improved Event Location in Nuclear Explosion Monitoring**

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Ben Lawry<sup>1</sup>, Marcus Chang<sup>1</sup>, Scott Phillips<sup>2</sup>

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<sup>2</sup>Los Alamos National Laboratory

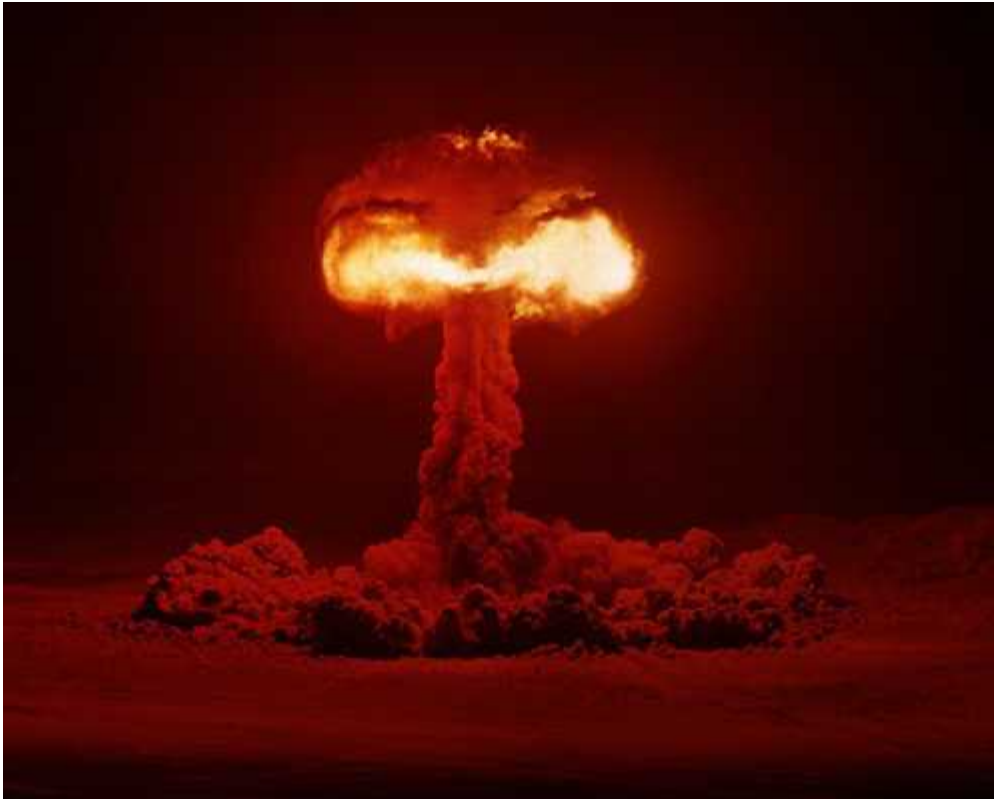
# Monitoring for Nuclear Explosions

Comprehensive Test Ban Treaty (CTBT)

Adopted by UN in 1996, ratified by 155 nations

China, Egypt, Indonesia, Iran, Israel, US have signed, but not ratified

India, North Korea, Pakistan have not signed

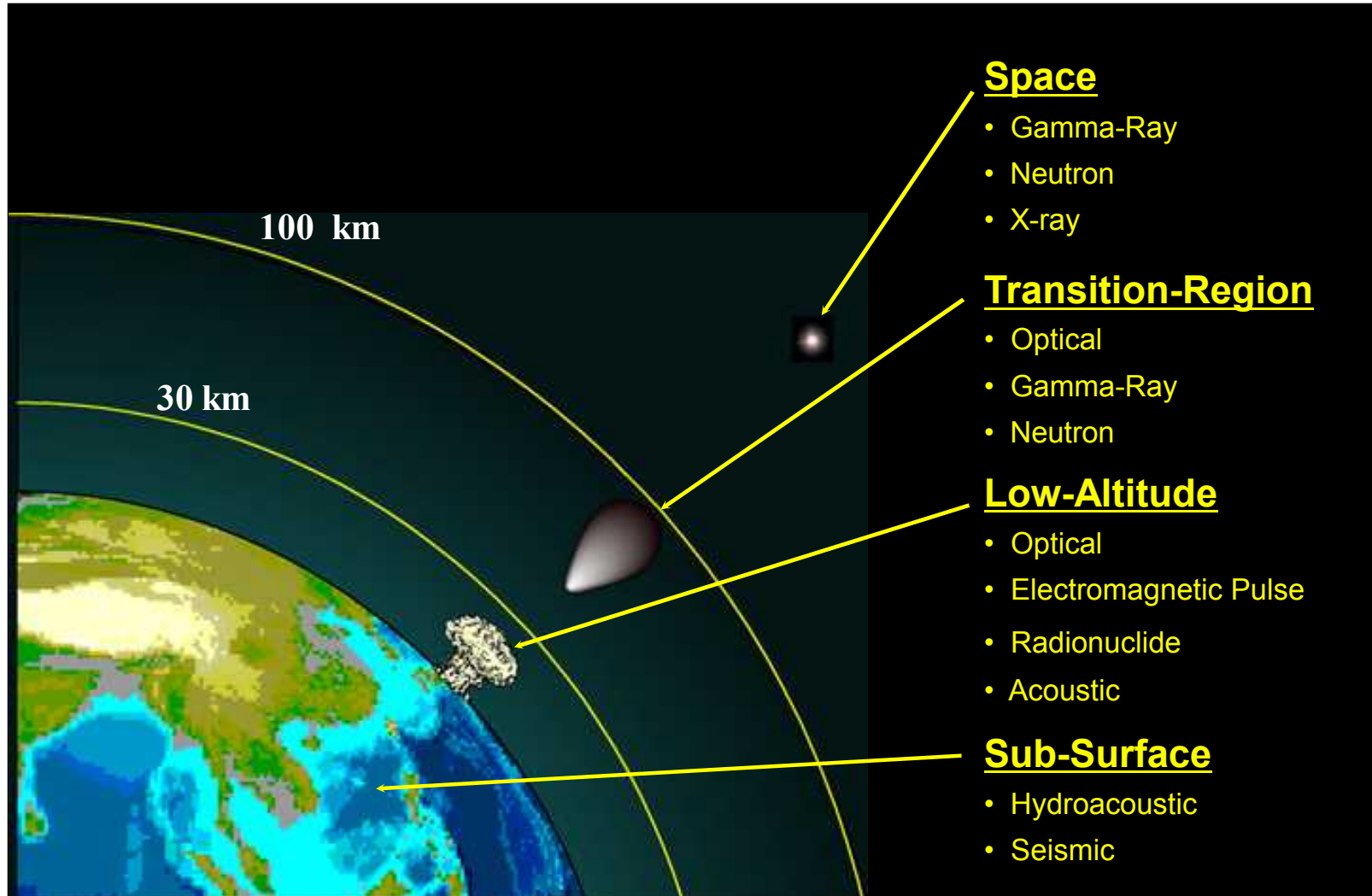


Comprehensive Test Ban  
Treaty Organization (CTBT)  
Vienna, Austria

US National Data Center,  
AFTAC, Patrick AFB, FL

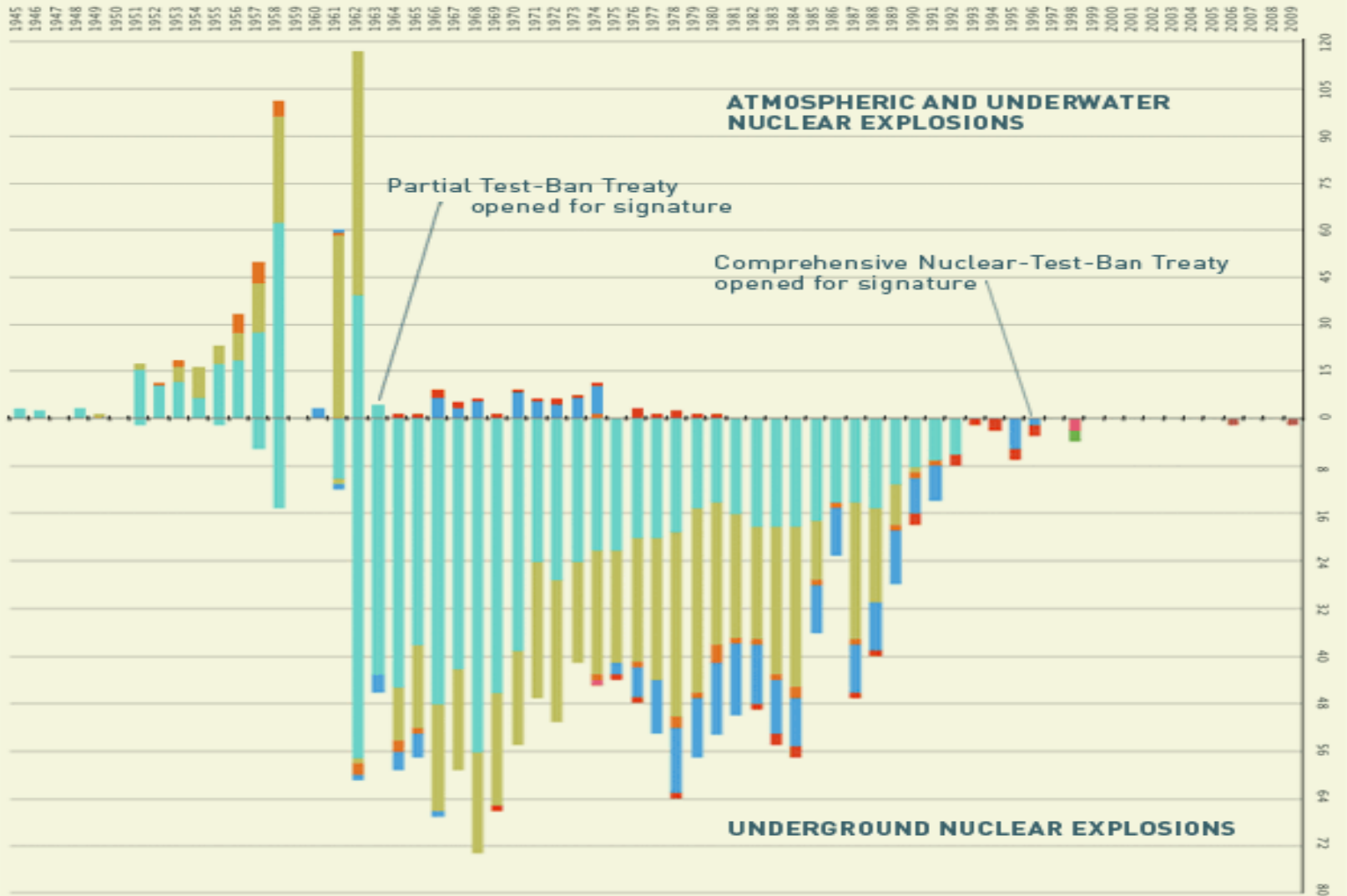
US Dept. of Energy  
provides R&D support

# Monitoring for Nuclear Explosions



**WORLDWIDE NUCLEAR TESTING:  
ATMOSPHERIC AND UNDERGROUND 1945-2009**

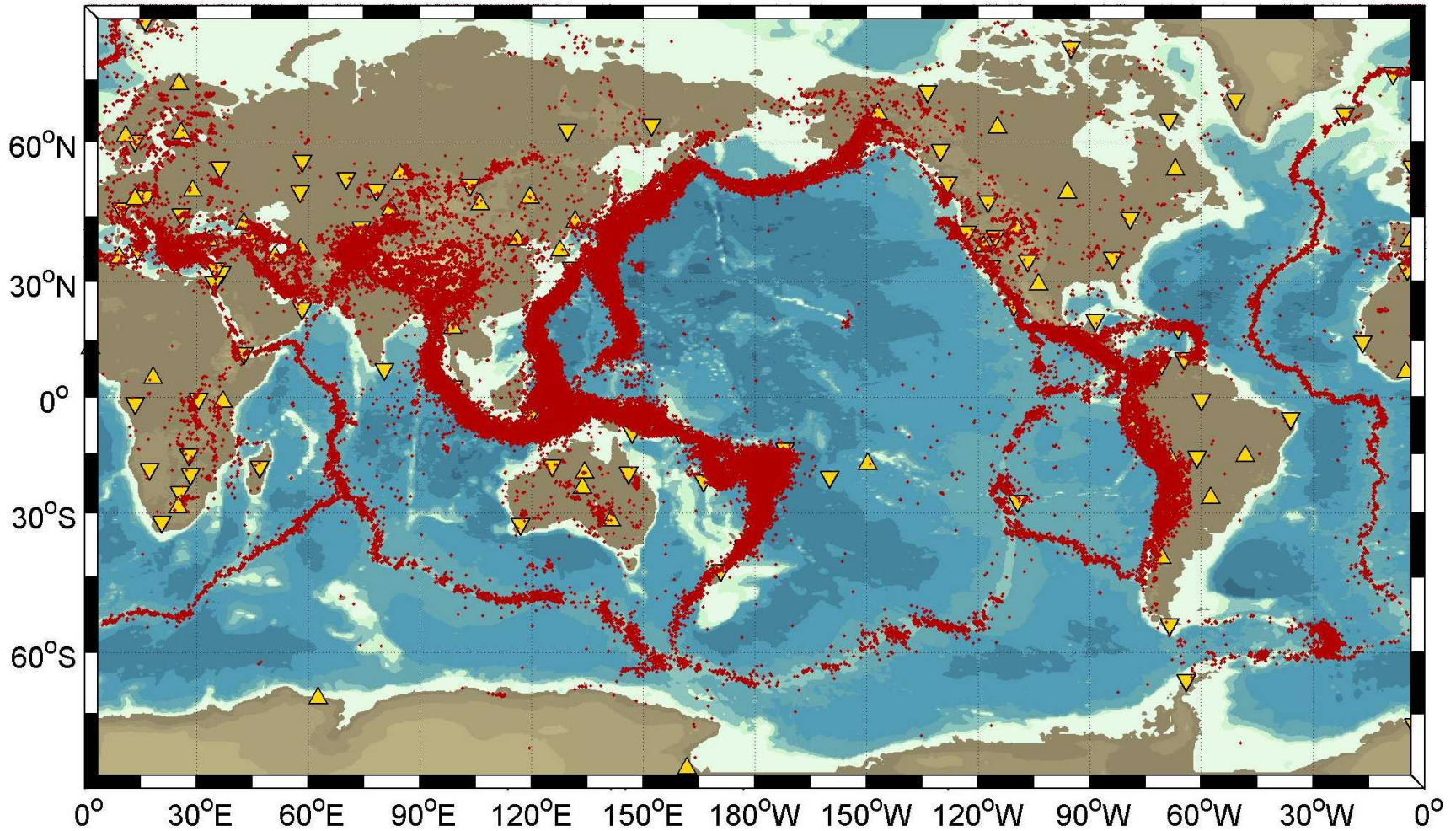
USA USSR/Russia UK France China India Pakistan DPRK

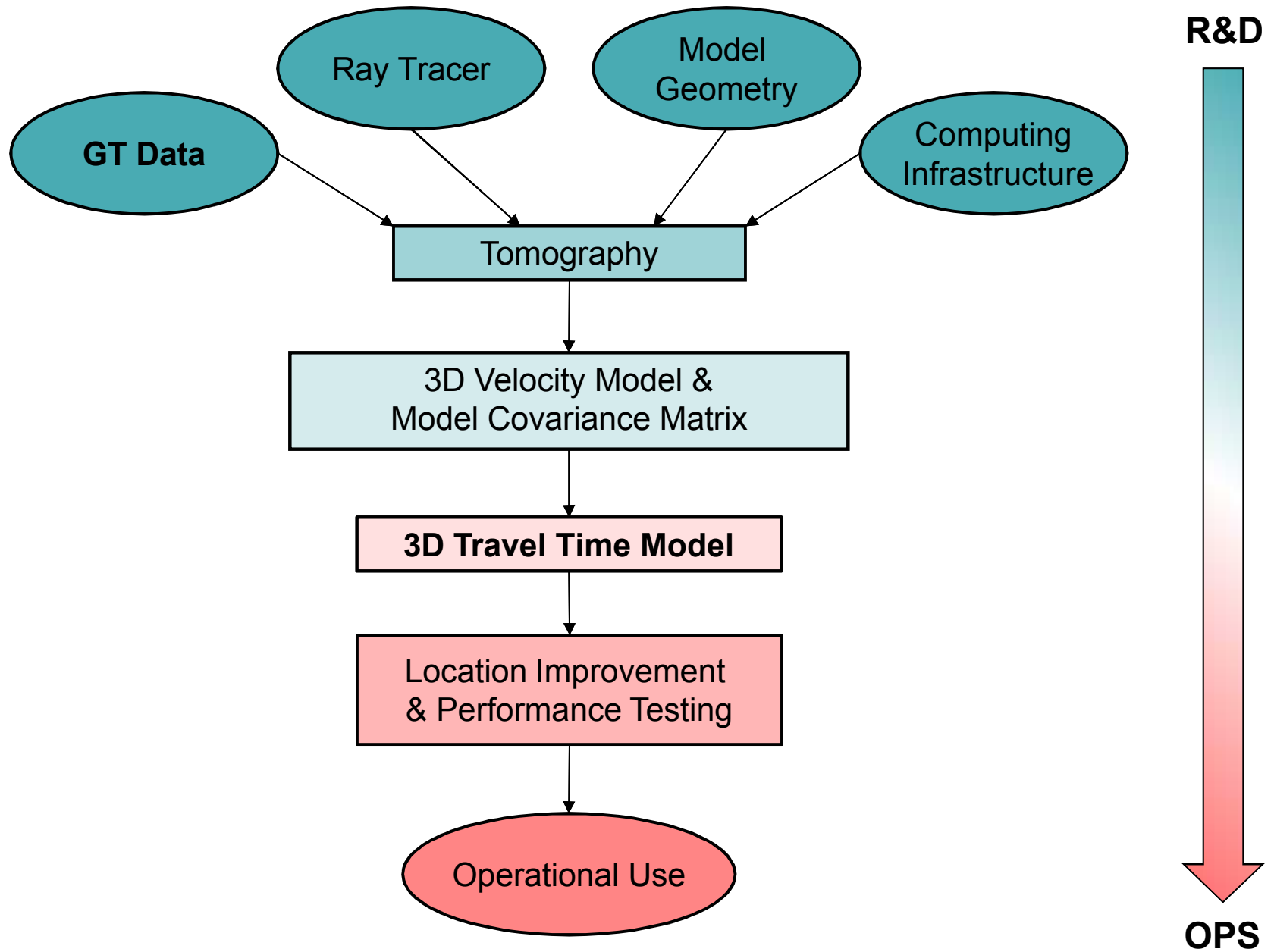


1945 1960 1970 1980 1990 2000 2009

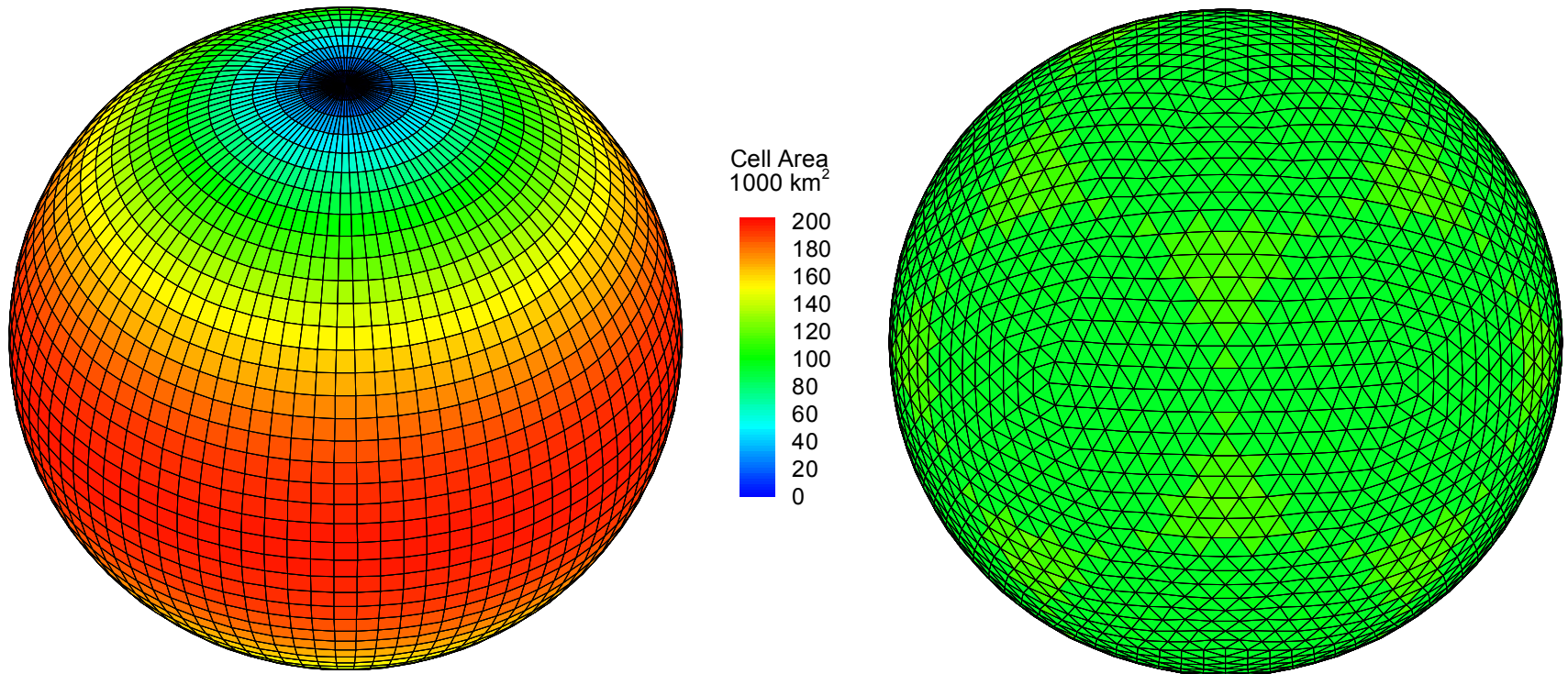
# Improve Accuracy and Precision of Seismic Event Locations

IDC REB 1999164-2009041, 227207 origins





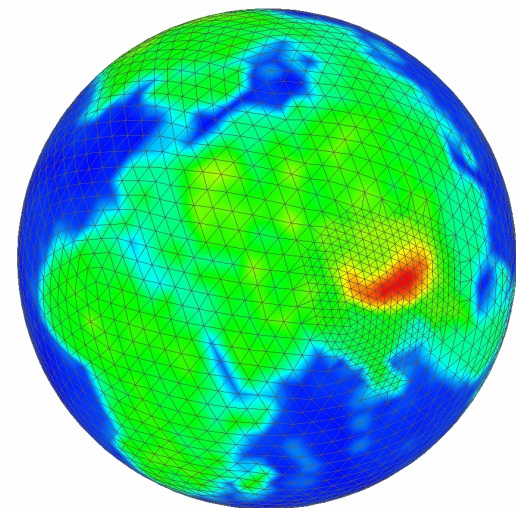
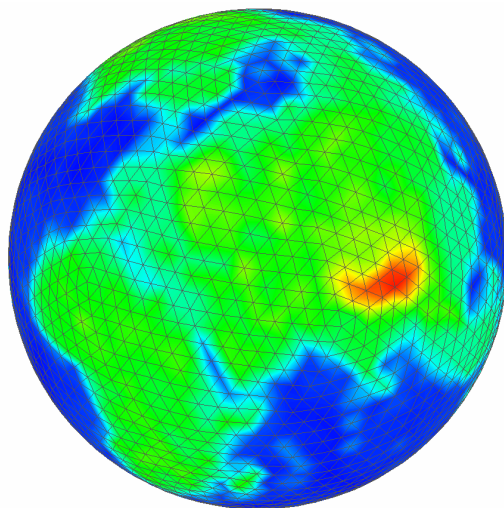
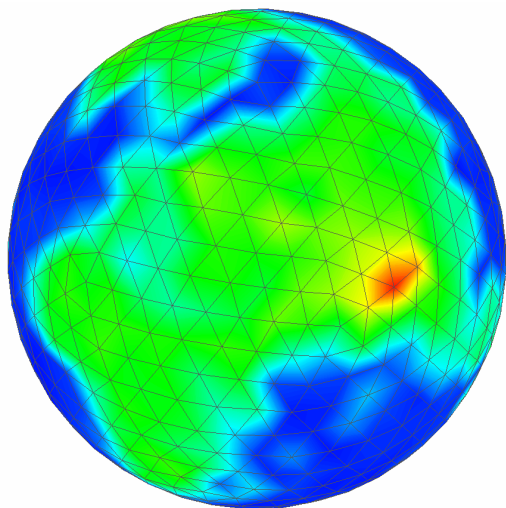
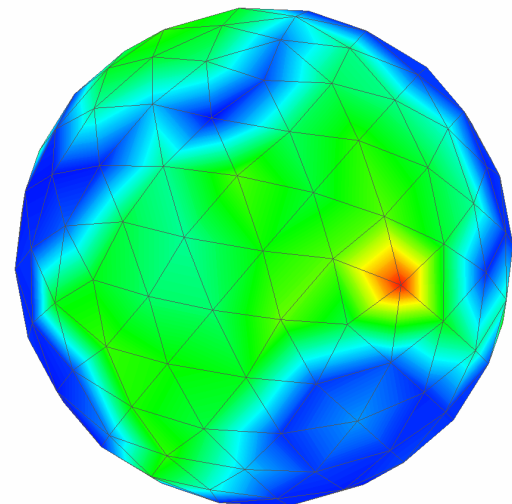
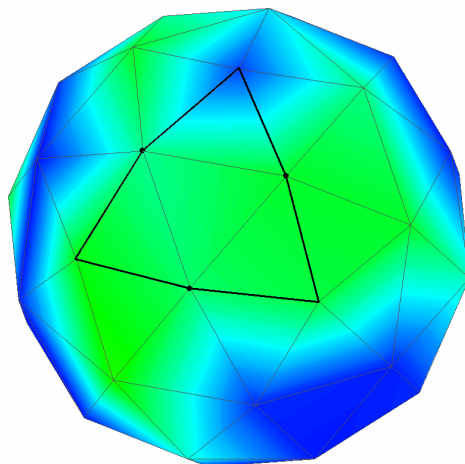
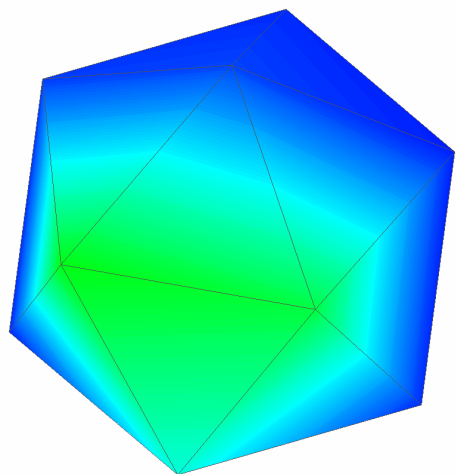
# Earth Model Representation



Wang, Z., and F. A. Dahlen (1995), Spherical-Spline Parameterization of Three-Dimensional Earth Models, *Geophys. Res. Lett.*, 22(22), 3099-3102.

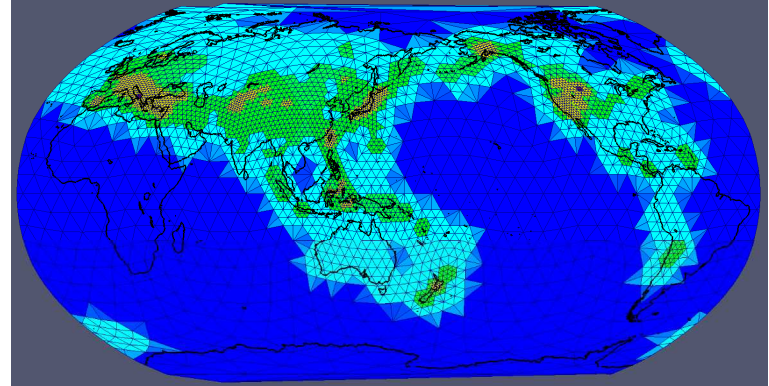
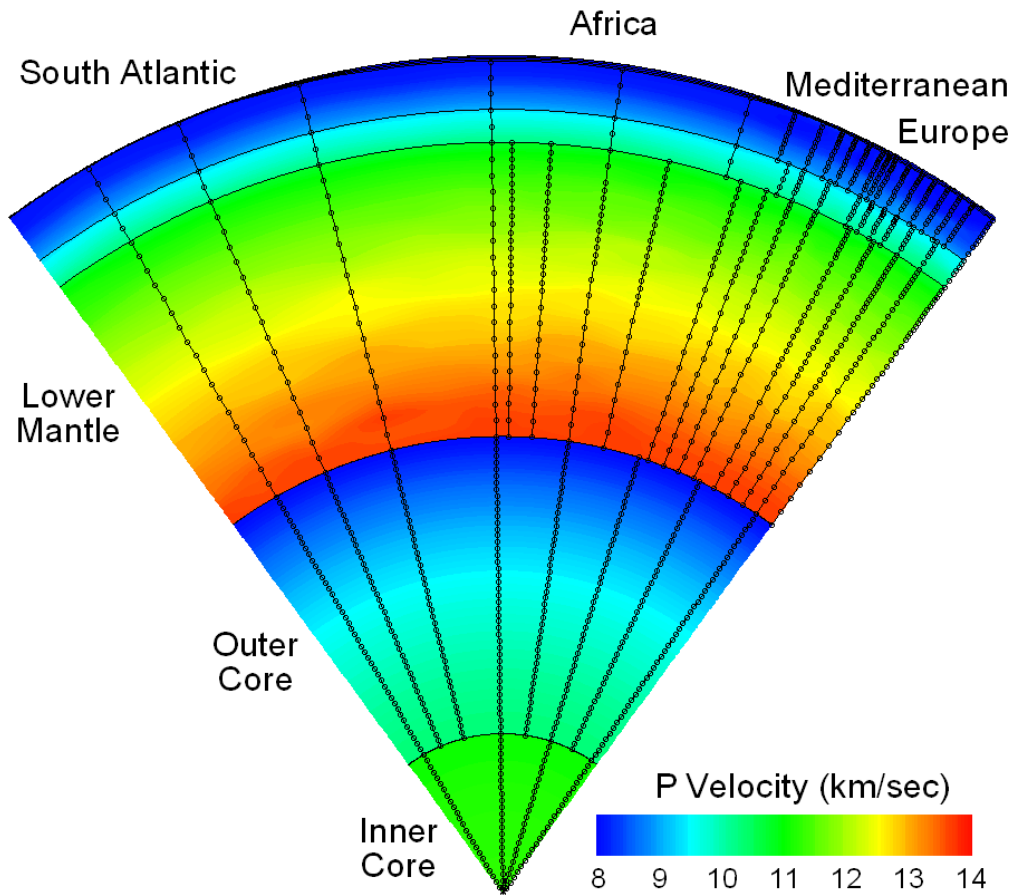
Ballard, S, J. R. Hipp, C. J. Young (2009), Efficient and accurate calculation of ray theory seismic travel time through variable resolution 3D earth models, *Seismological Research Letters*, 80, 989-999.

# Construction of Triangular Tesselation

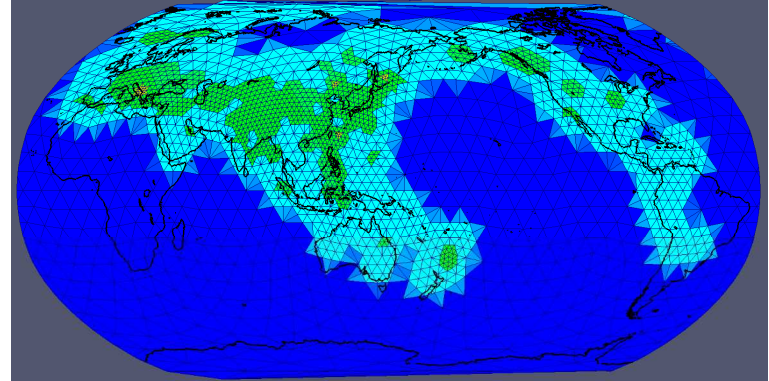
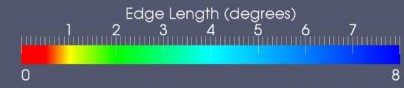




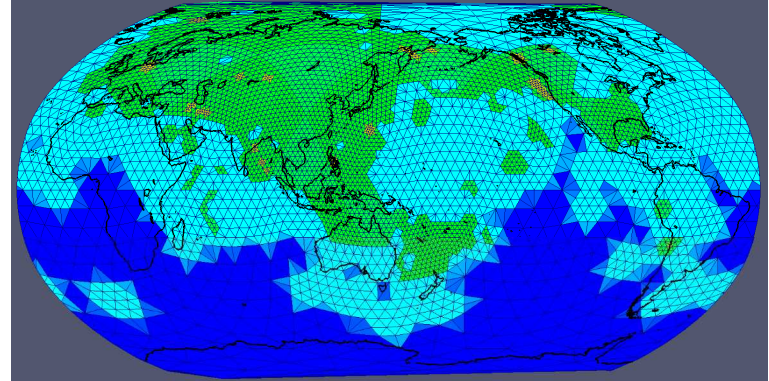
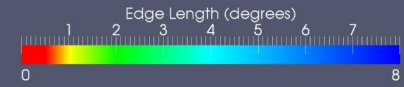
# Variable Resolution in Geographic and Radial Dimensions



STEP 5  
UPPER MANTLE



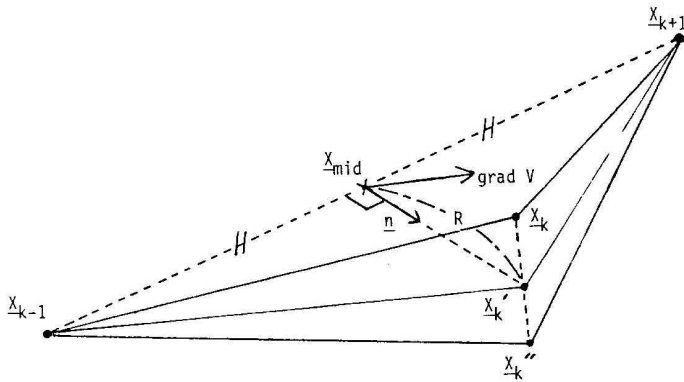
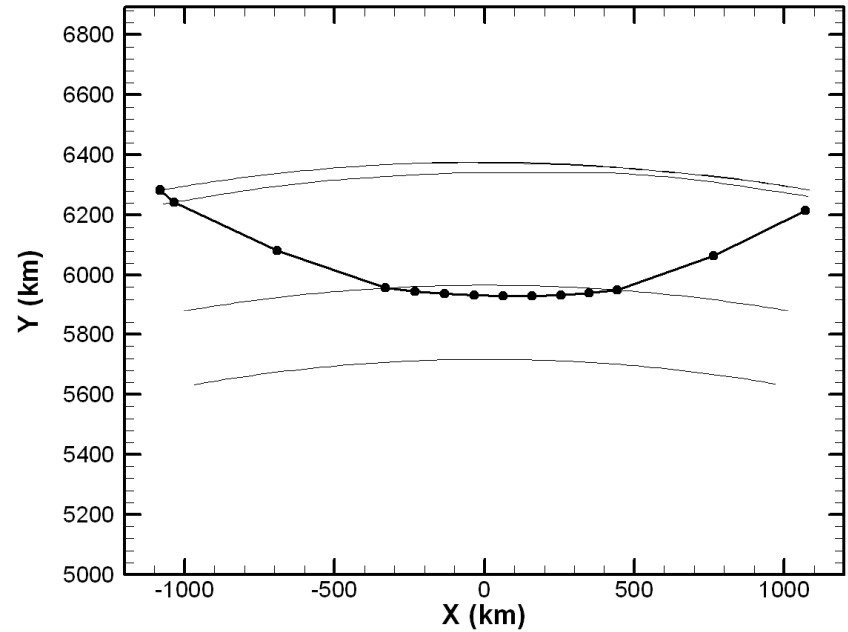
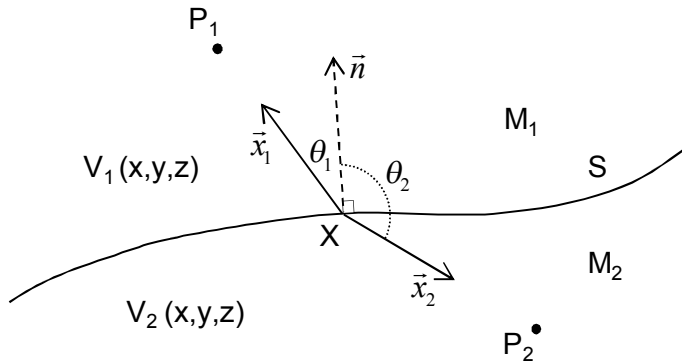
STEP 5  
TRANSITION ZONE



STEP 5  
LOWER MANTLE



# Pseudo Bending



Algorithm:

loop:

loop:

enforce Snell's Law

bend the intermediate points

until travel time stable

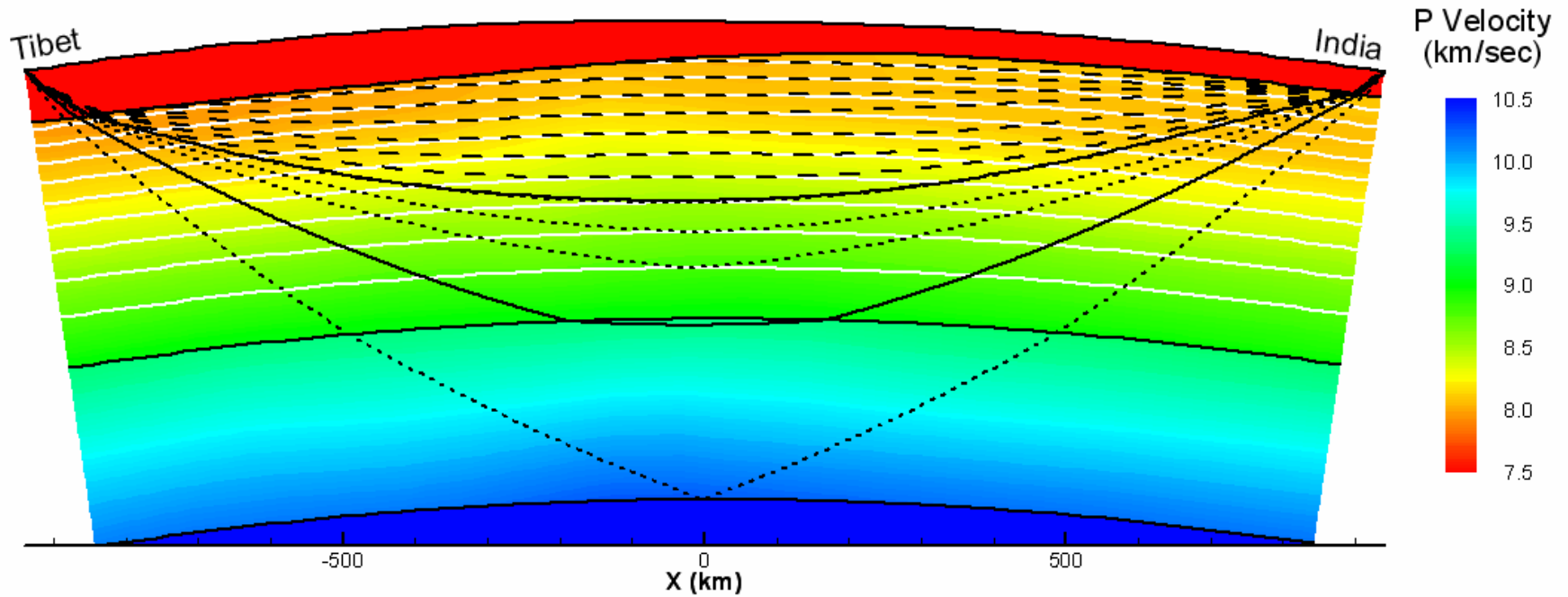
double nodes

until travel time stable

Um, J. and C. H. Thurber (1987). A fast algorithm for two-point seismic ray tracing, Bull. Seismol. Soc. Am., 77, 972-986.

Zhao, D. and J. Lei (2004), Seismic ray path variations in a 3D global velocity model, Physics of the Earth and Planetary Interiors, 141, 153-166.

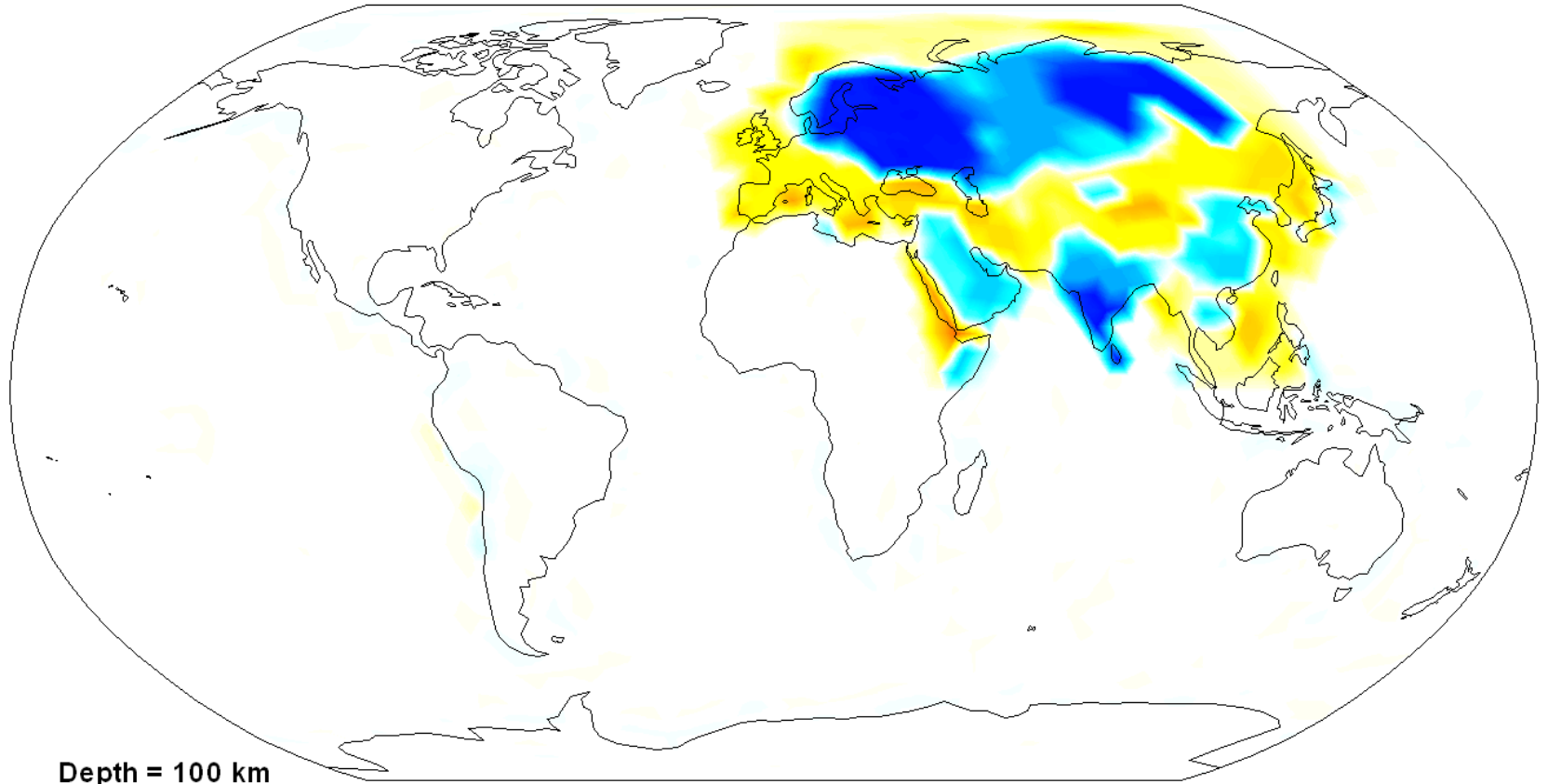
# Ray Tracing with Bender



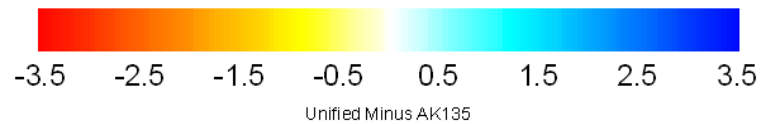
Um, J. and C. H. Thurber (1987). A fast algorithm for two-point seismic ray tracing, *Bull. Seismol. Soc. Am.*, 77, 972-986.

Zhao, D. and J. Lei (2004), Seismic ray path variations in a 3D global velocity model, *Physics of the Earth and Planetary Interiors*, 141, 153–166.

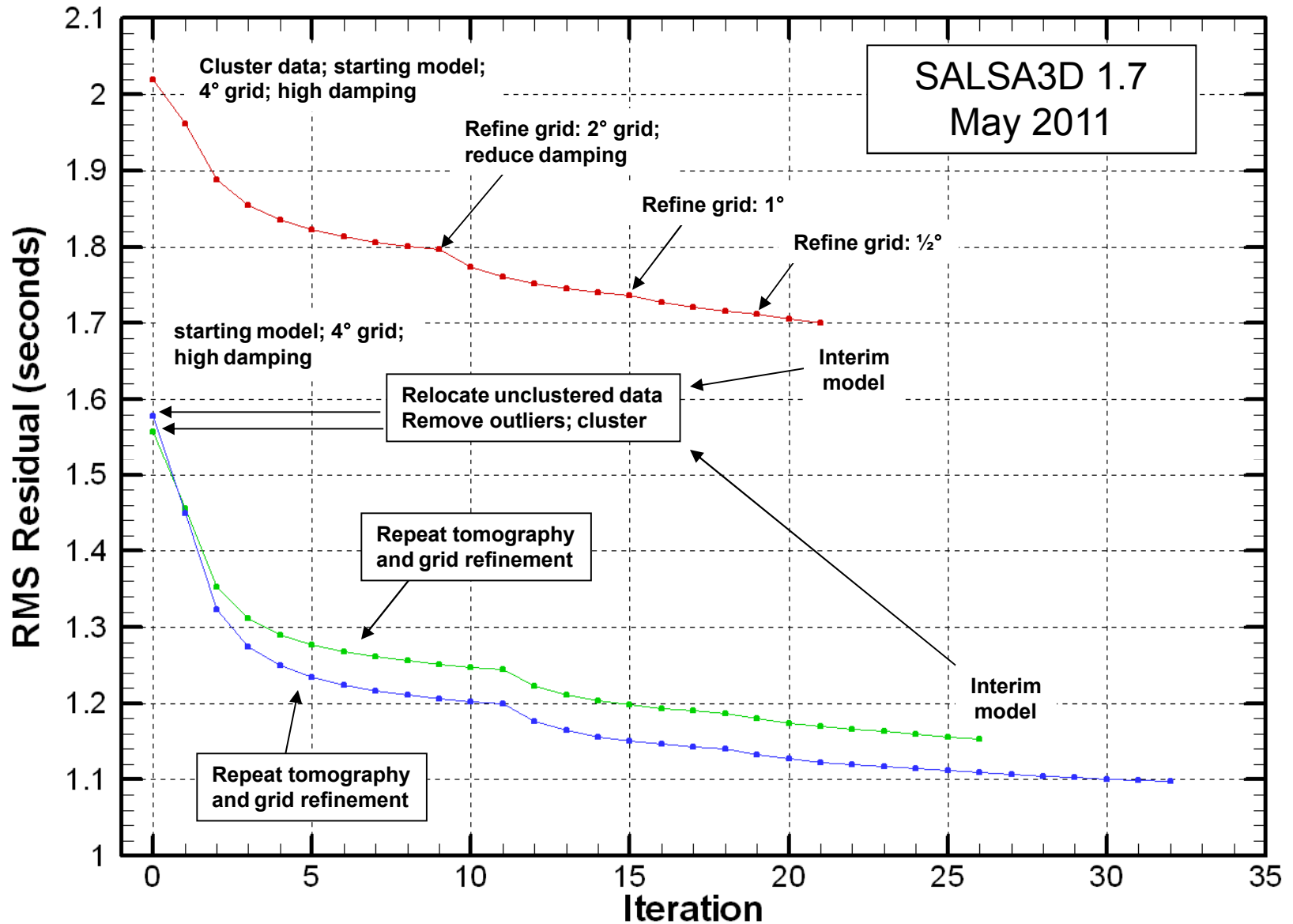
# Starting Model



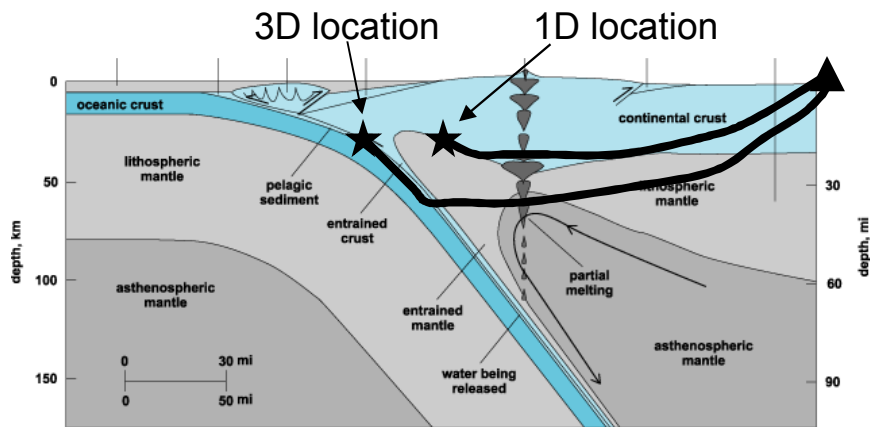
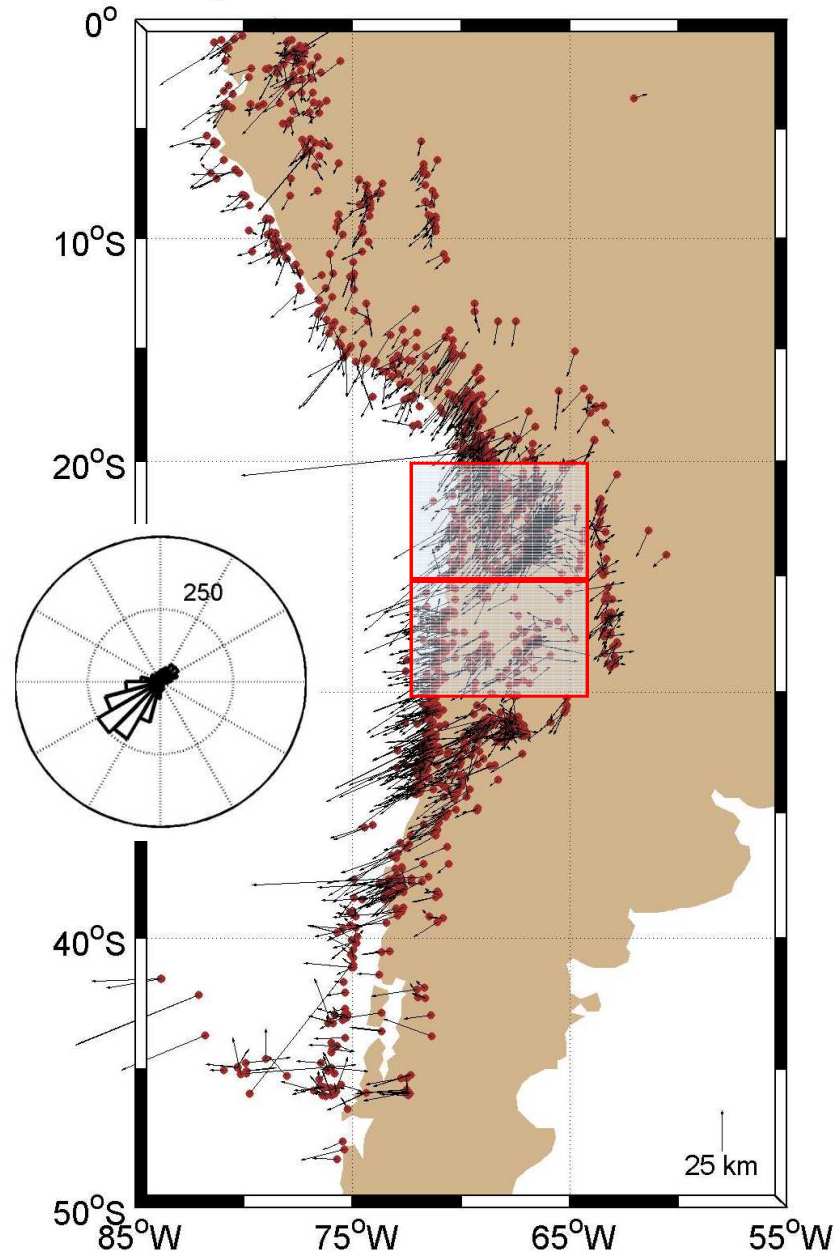
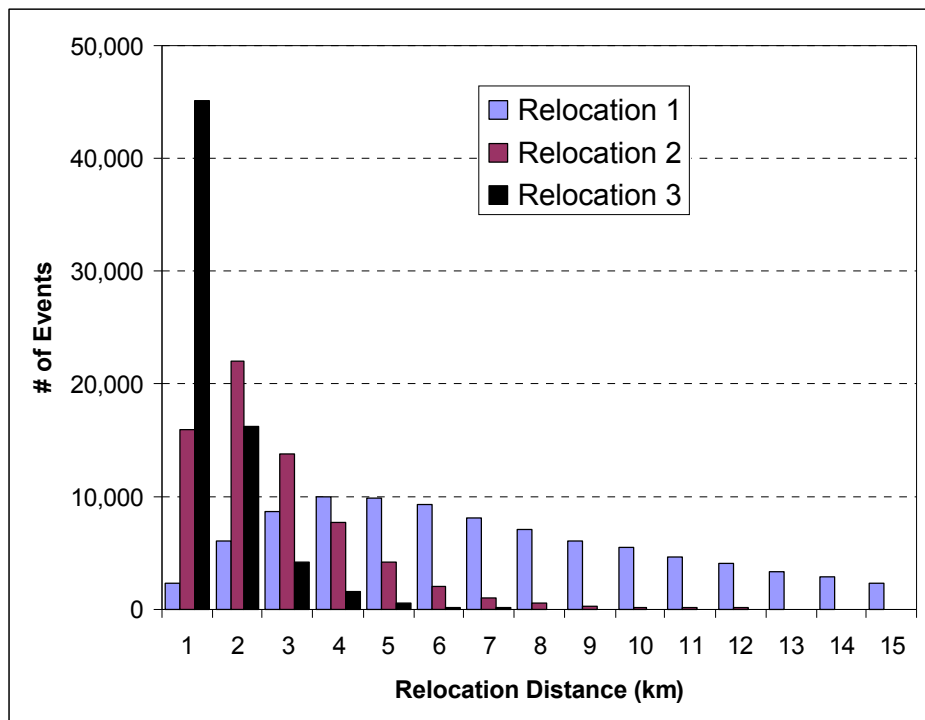
Vp % Change from AK135



# Tomographic Procedure – Event Relocation



# Relocation Step



# Model Resolution

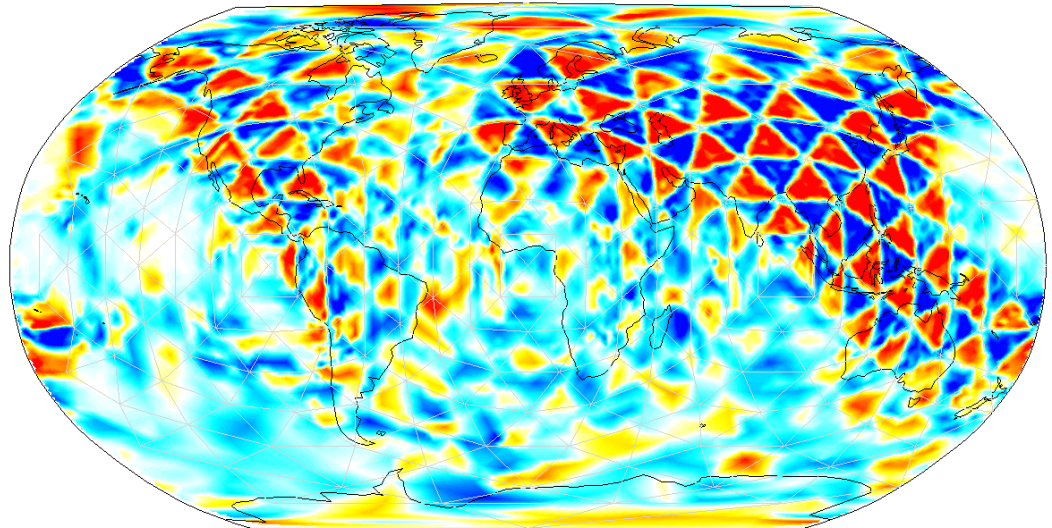
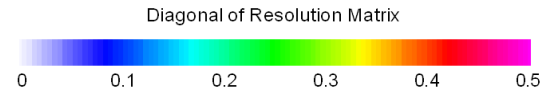
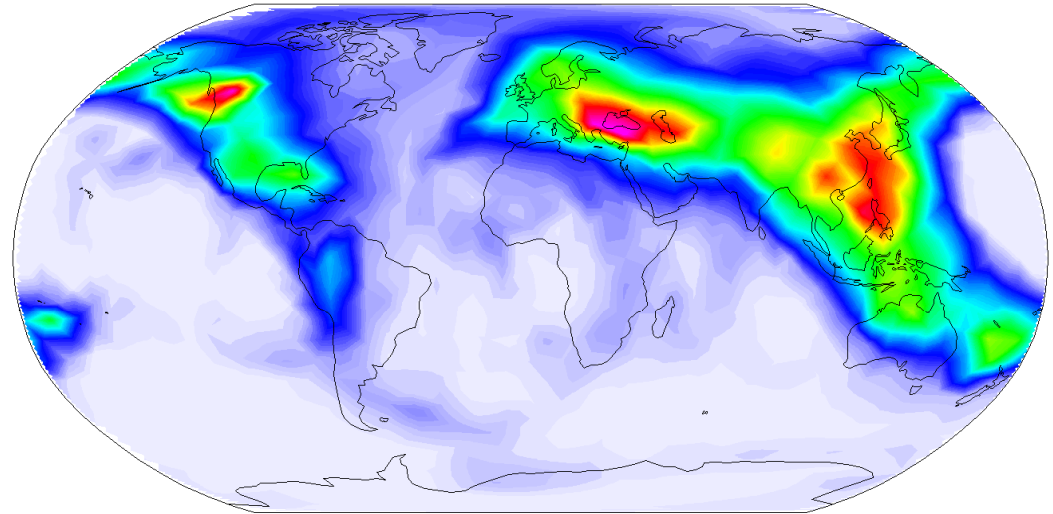
$$\begin{bmatrix} A \\ \alpha L \end{bmatrix} \Delta s = \begin{bmatrix} \Delta d \\ 0 \end{bmatrix}$$

$$G \Delta s = \begin{bmatrix} \Delta d \\ 0 \end{bmatrix}$$

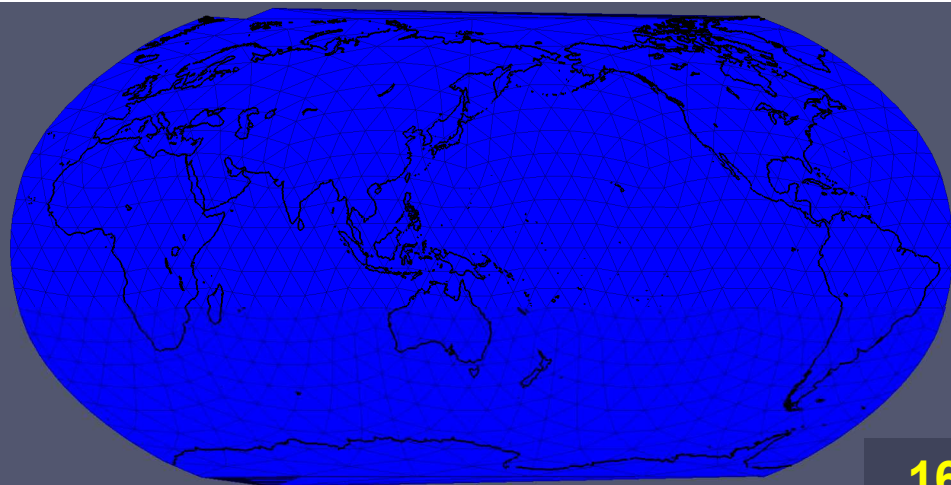
$$\Delta s = (G^T G)^{-1} A^T \Delta d$$

$$\Delta s = (G^T G)^{-1} A^T A \Delta s_{true}$$

$$R = (G^T G)^{-1} A^T A$$



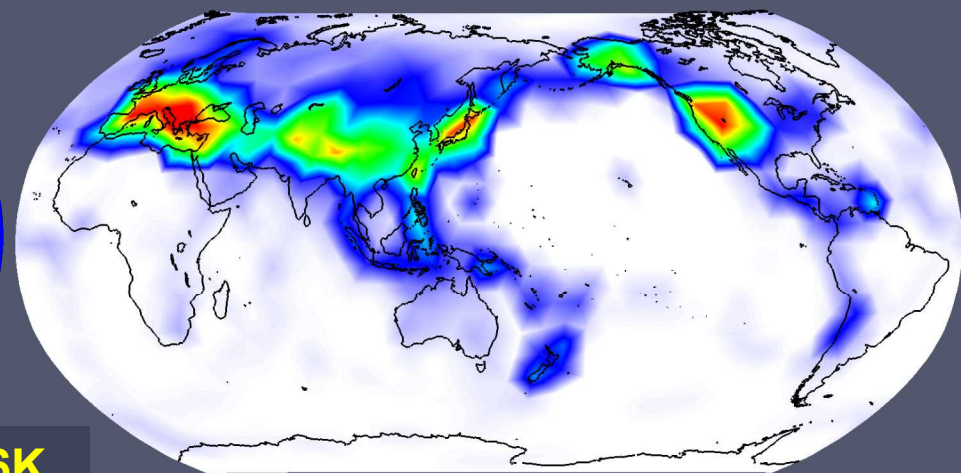
# STEPS 1 & 5



STEP 1  
UPPER MANTLE

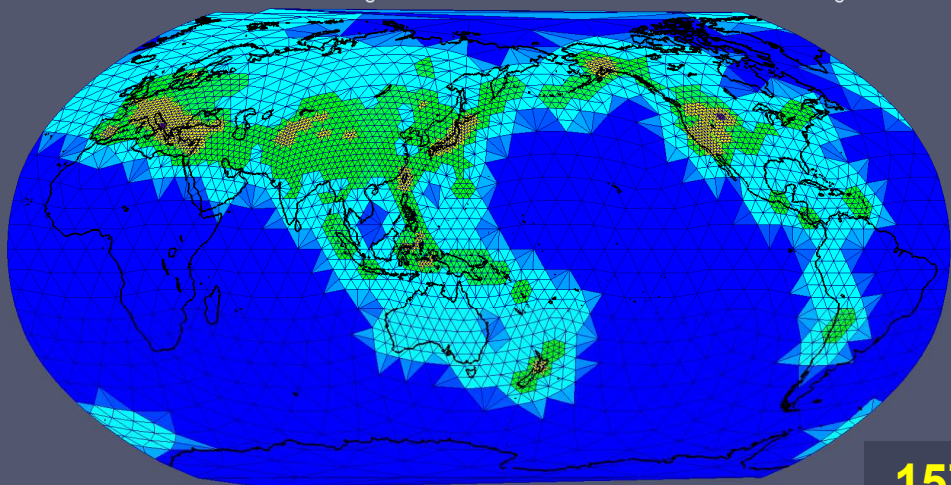


16K



Depth: 40 km

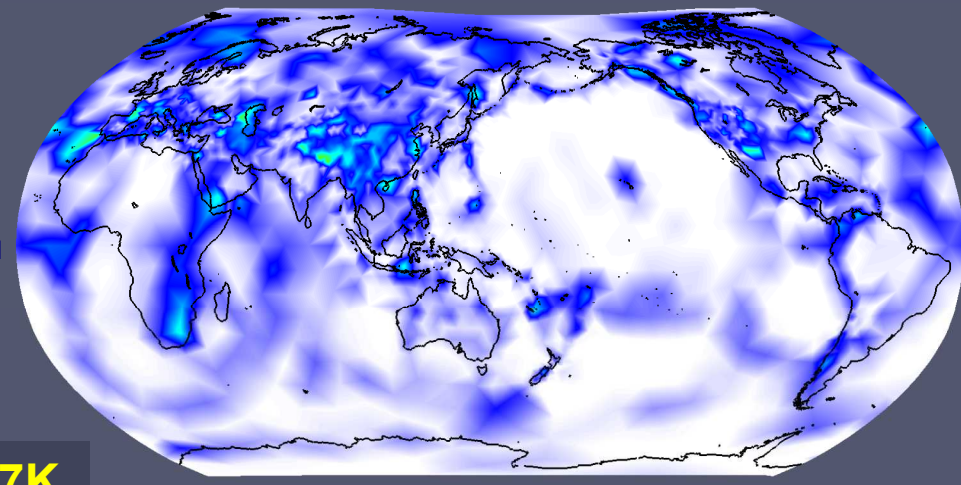
SALSA3D TOMO110926\_1\_11



STEP 5  
UPPER MANTLE



157K



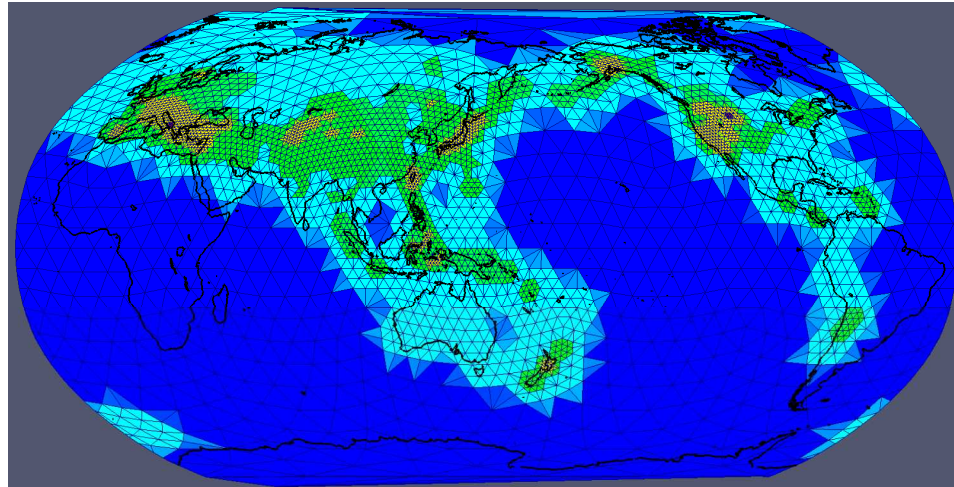
Depth: 40 km

SALSA3D TOMO110926\_5\_7

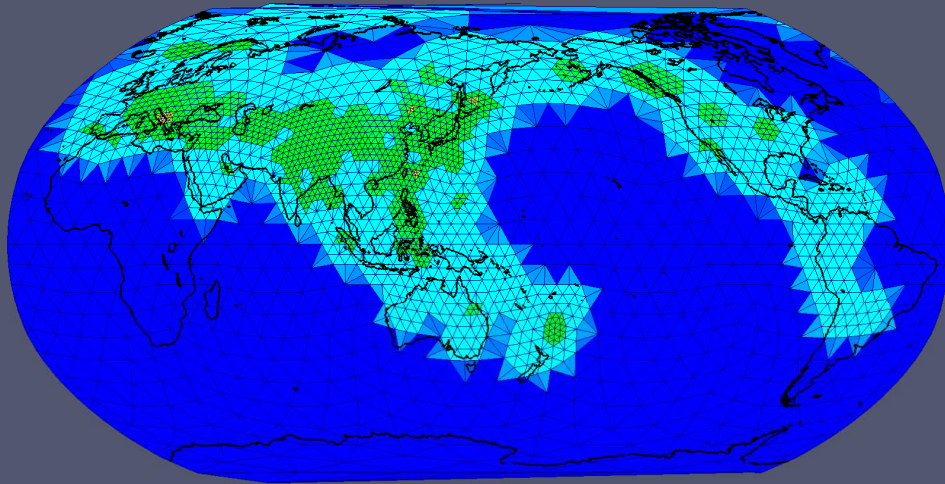




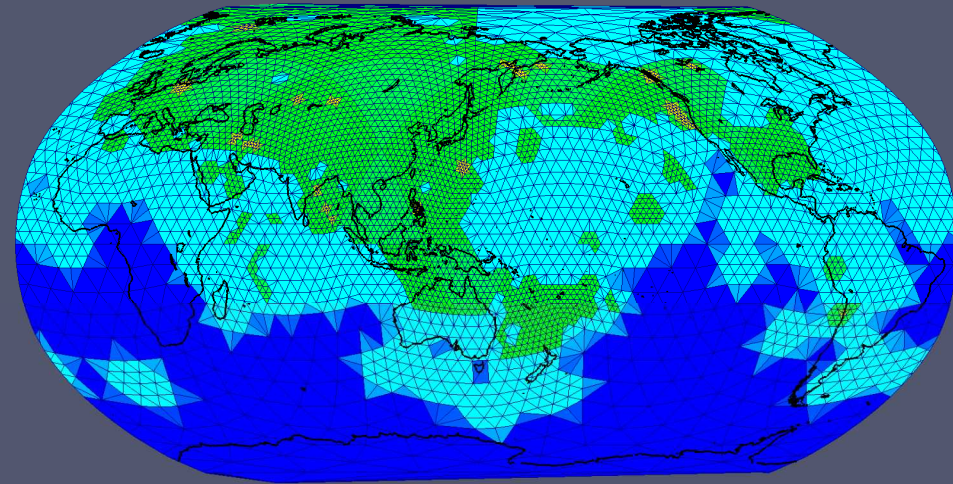
# Final Grid



STEP 5  
UPPER MANTLE



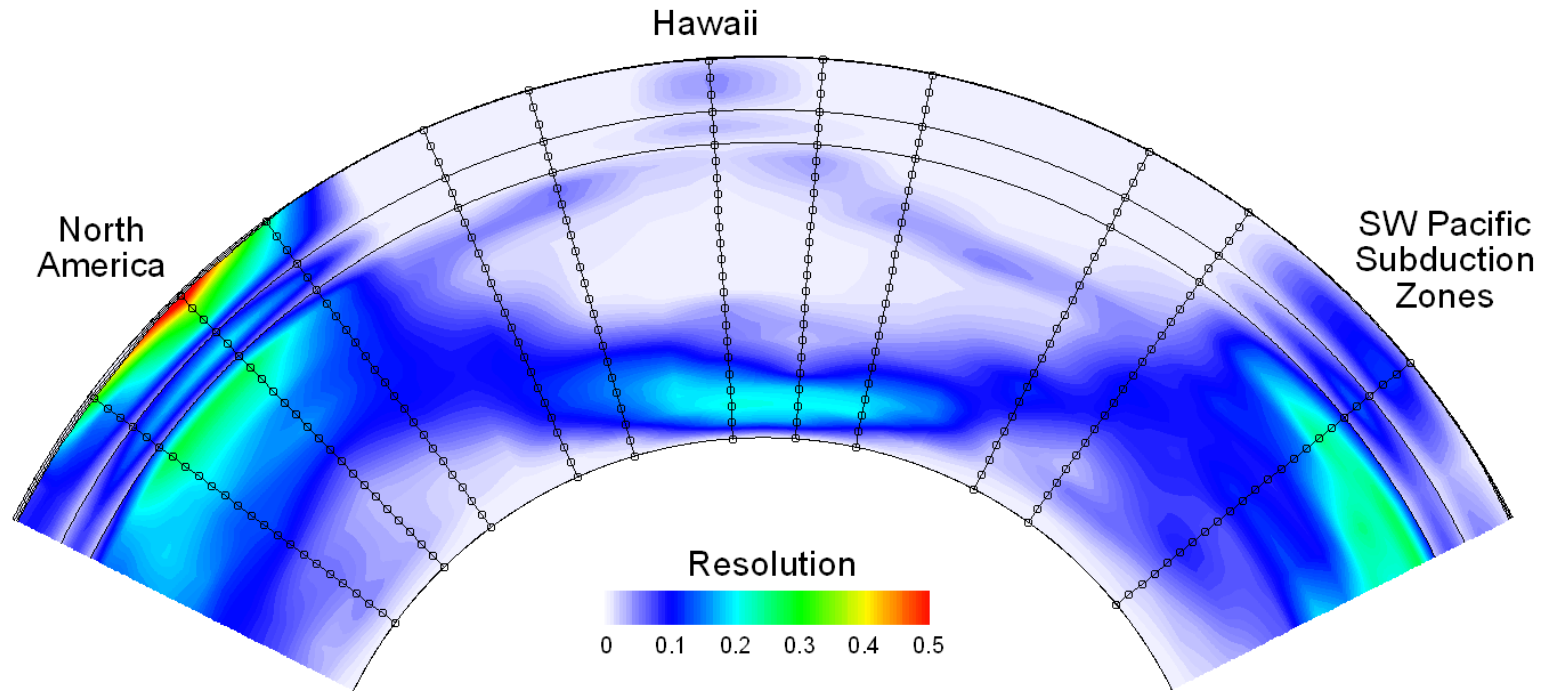
STEP 5  
TRANSITION ZONE



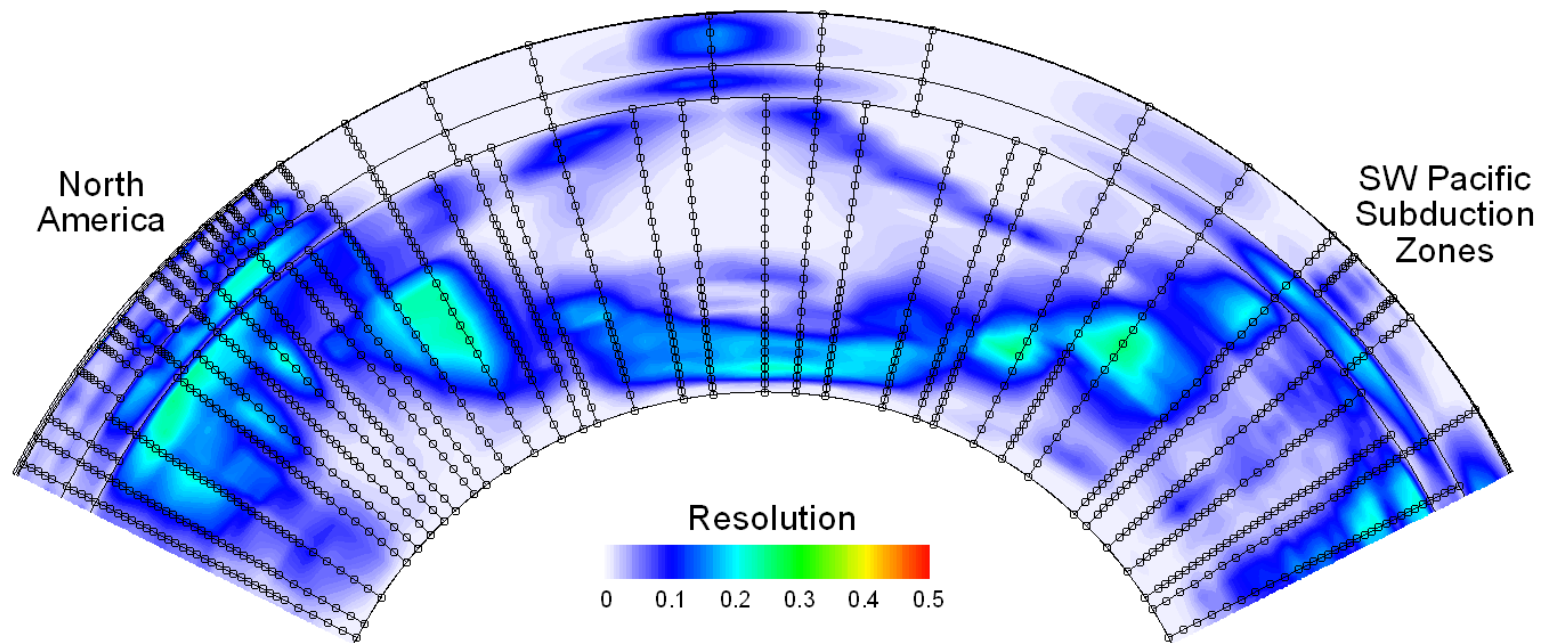
STEP 5  
LOWER MANTLE



Step 1

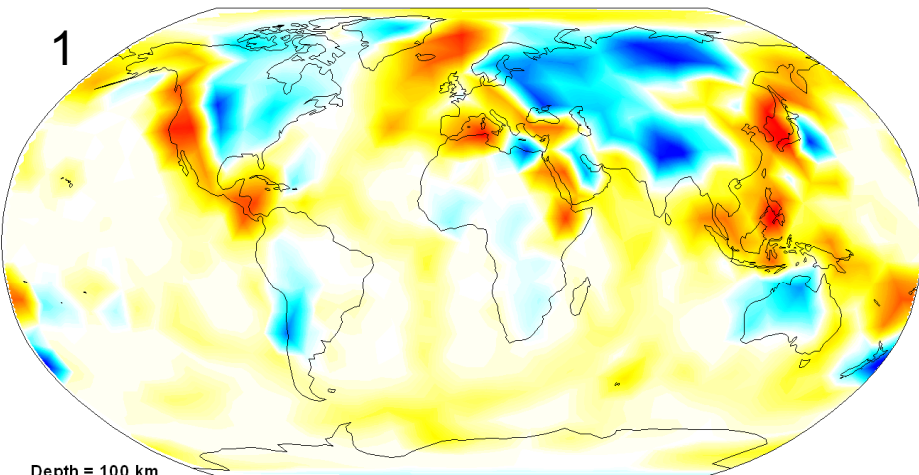


Step 5

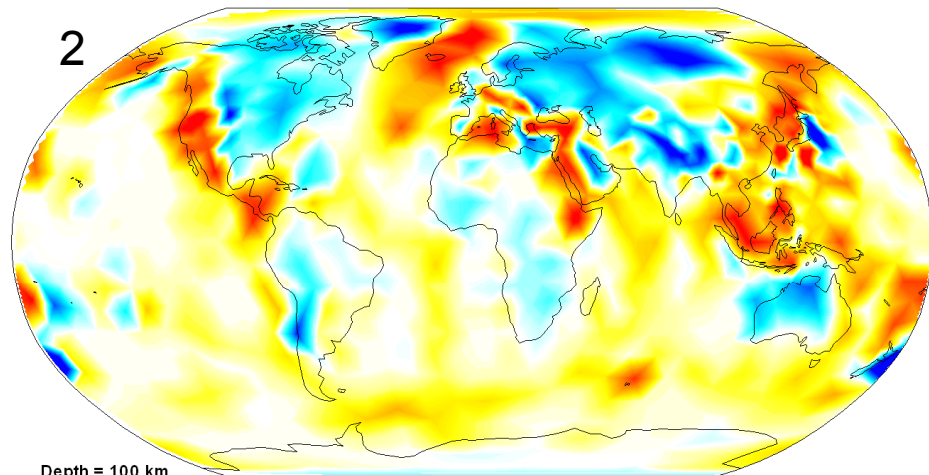


# SALSA3D

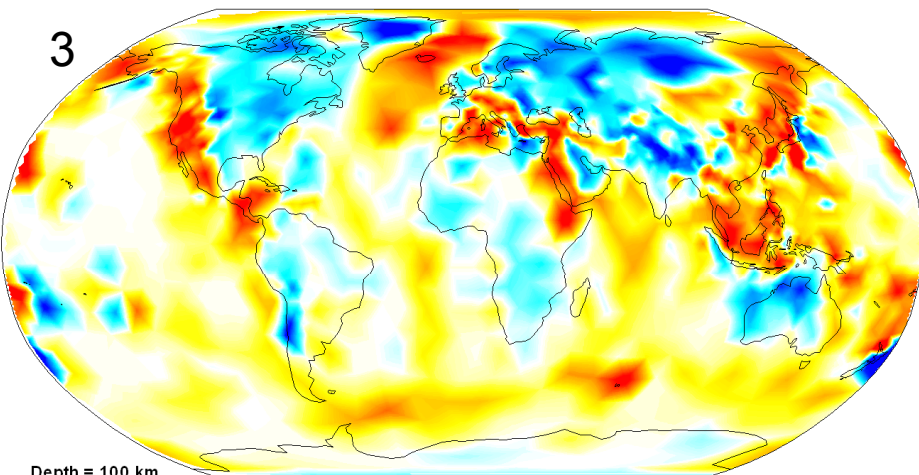
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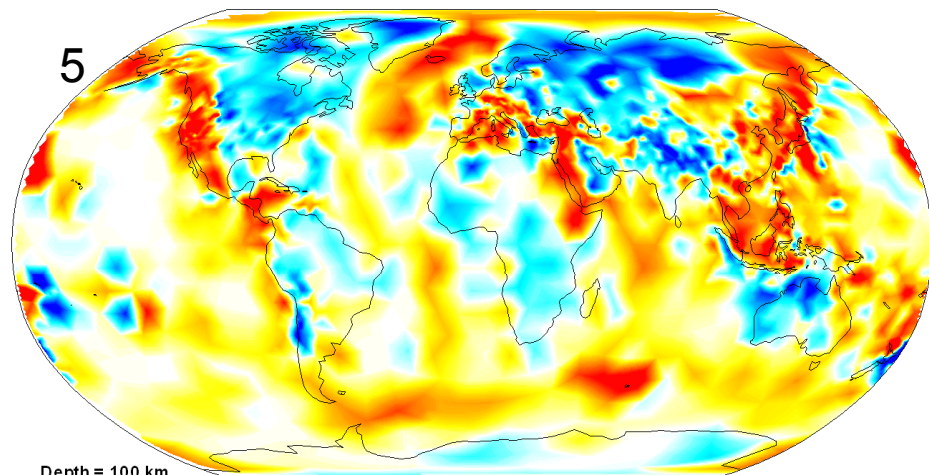
2



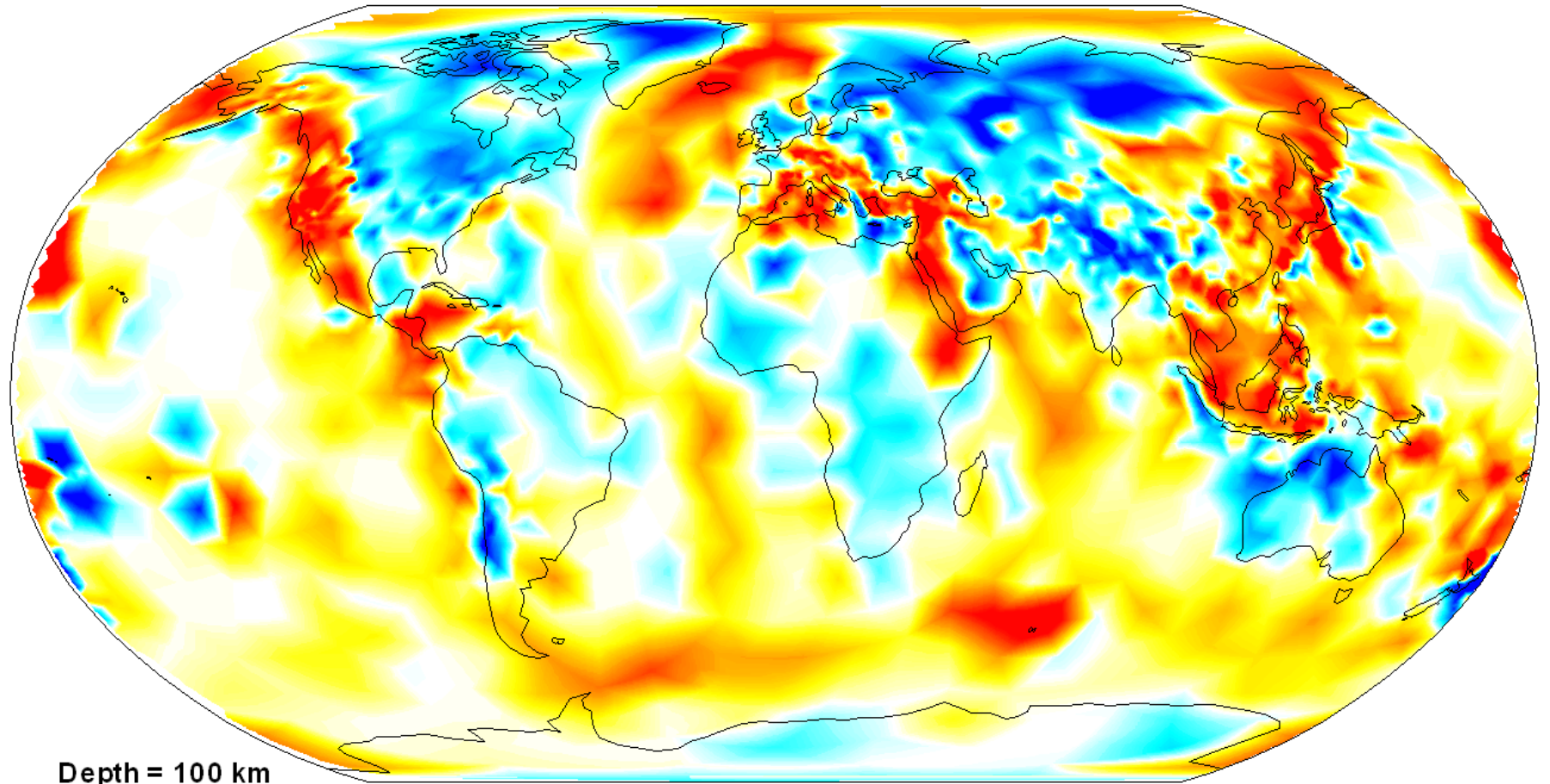
3



5

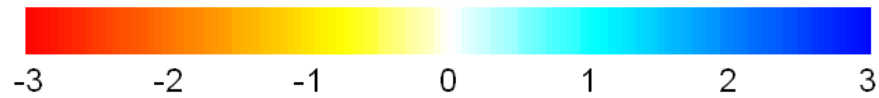


# SALSA3D

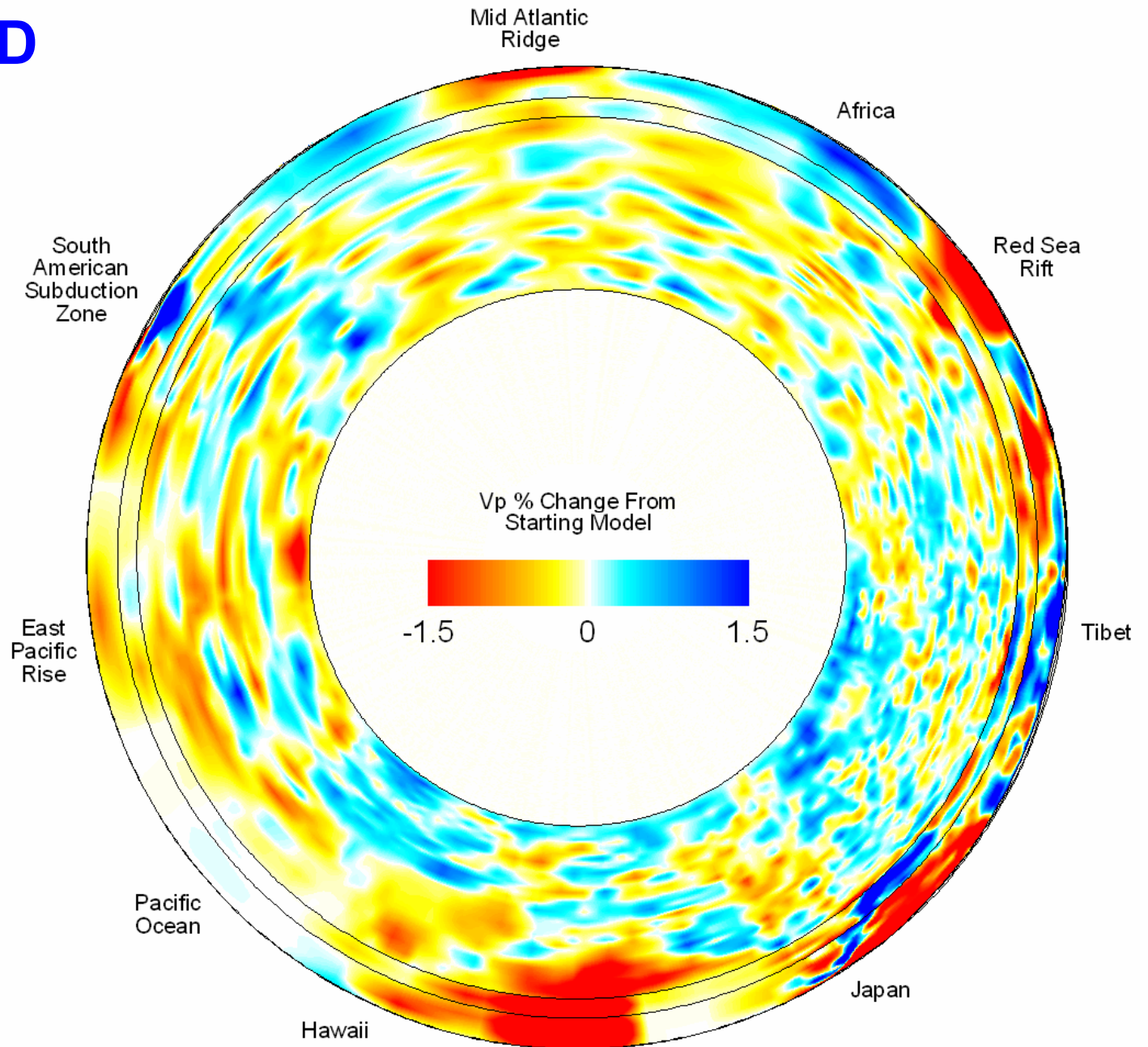


Depth = 100 km

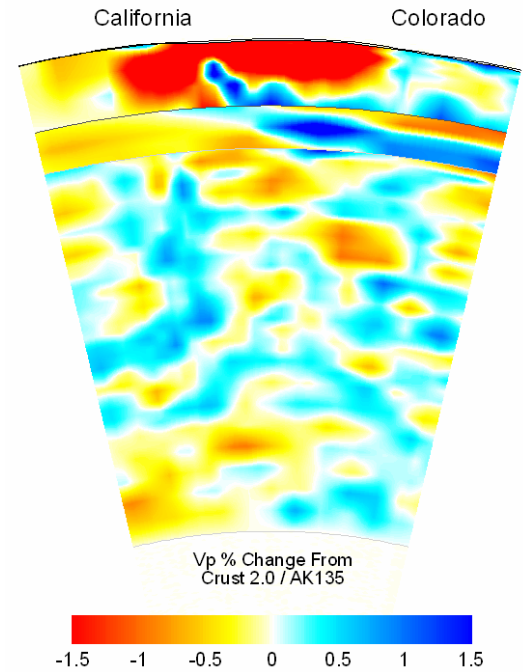
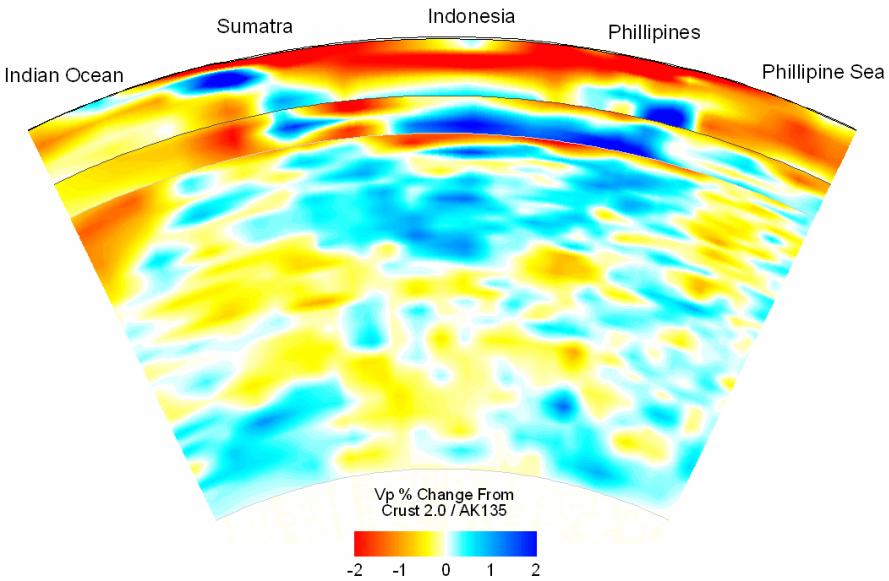
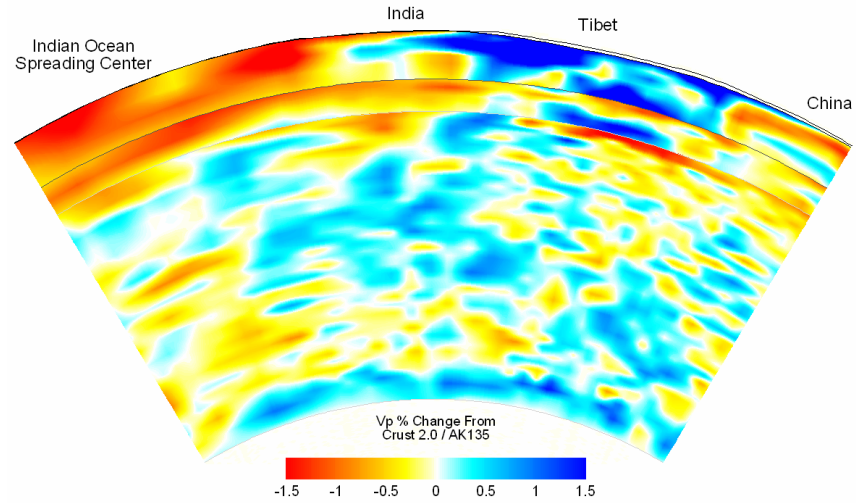
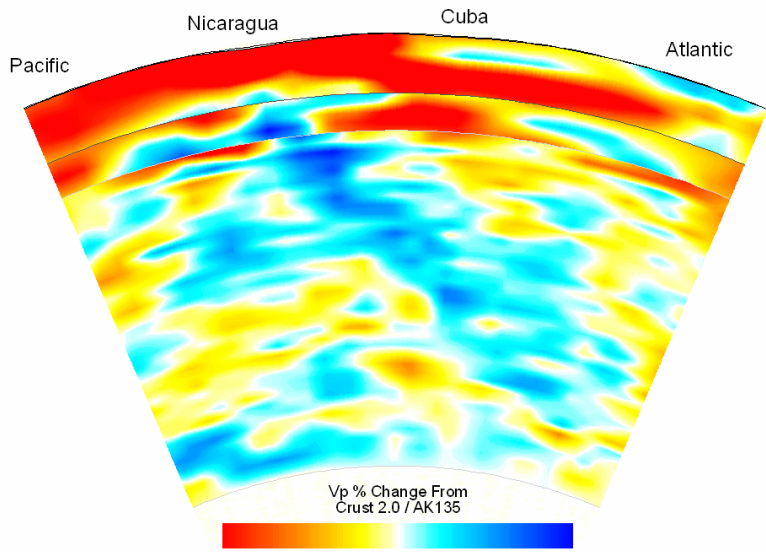
$V_p$  % Change from AK135



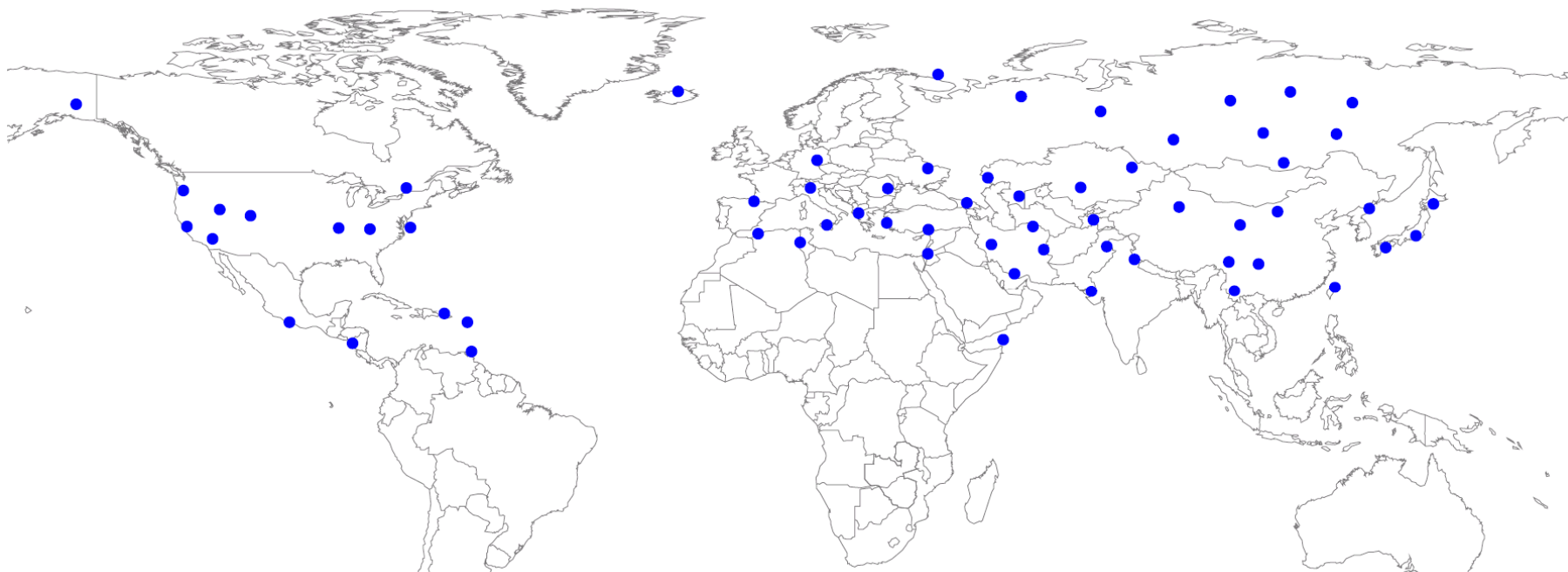
# SALSA3D



# SALSA3D

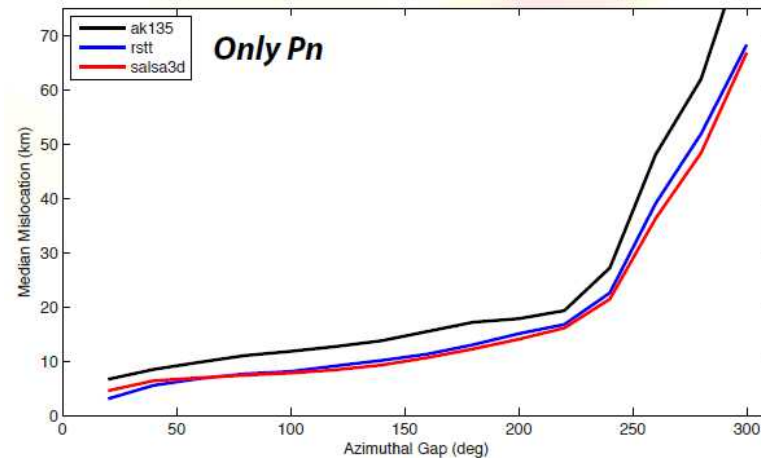
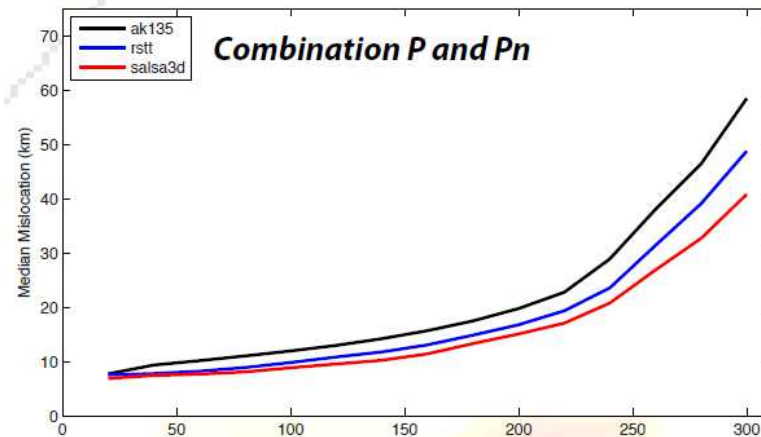
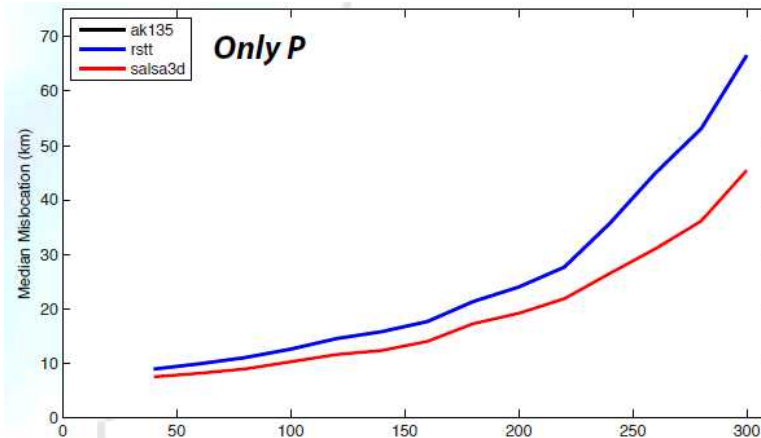
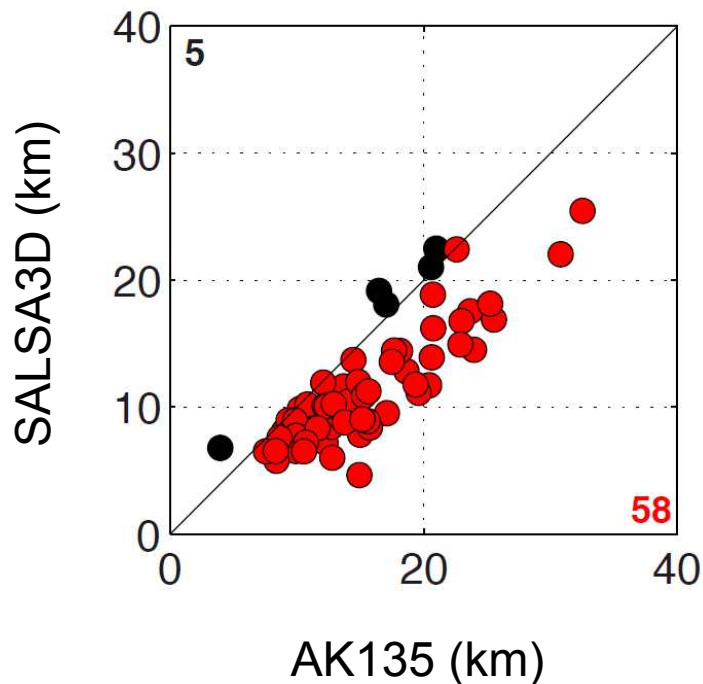


# Validation Events – Left out of tomography



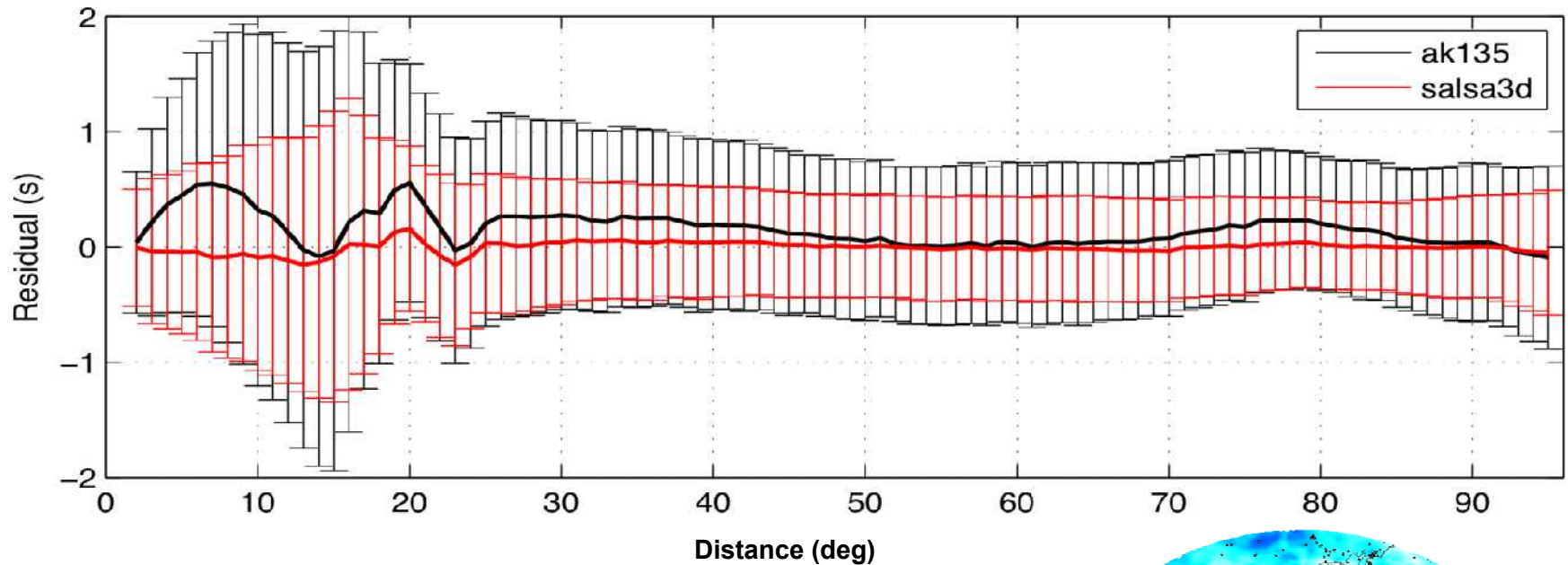
# Seismic Event Location Improvement

## Event Mislocation

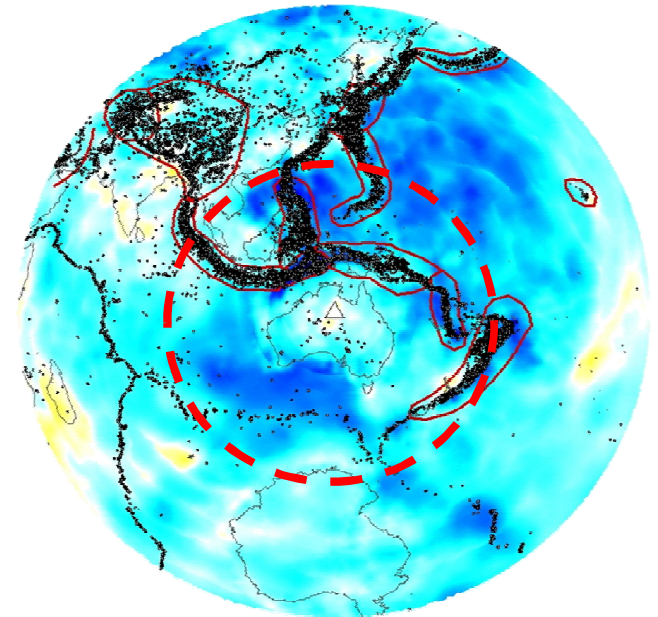




# Travel Time Uncertainty – Traditional Approach



- Uncertainty a function only of distance
- Independent of station, azimuth
- Must account for pick uncertainty

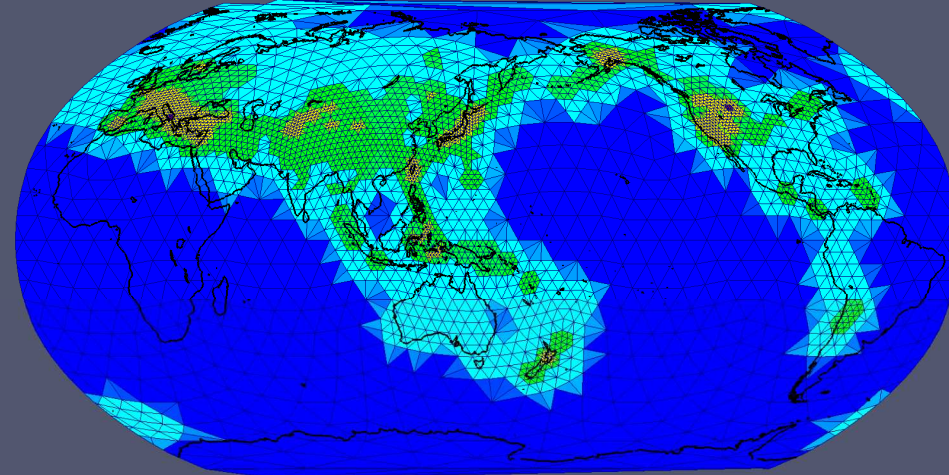
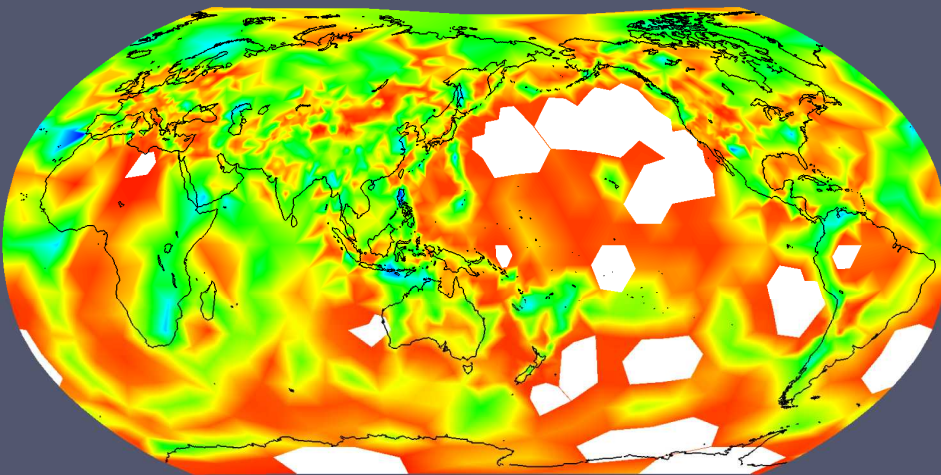
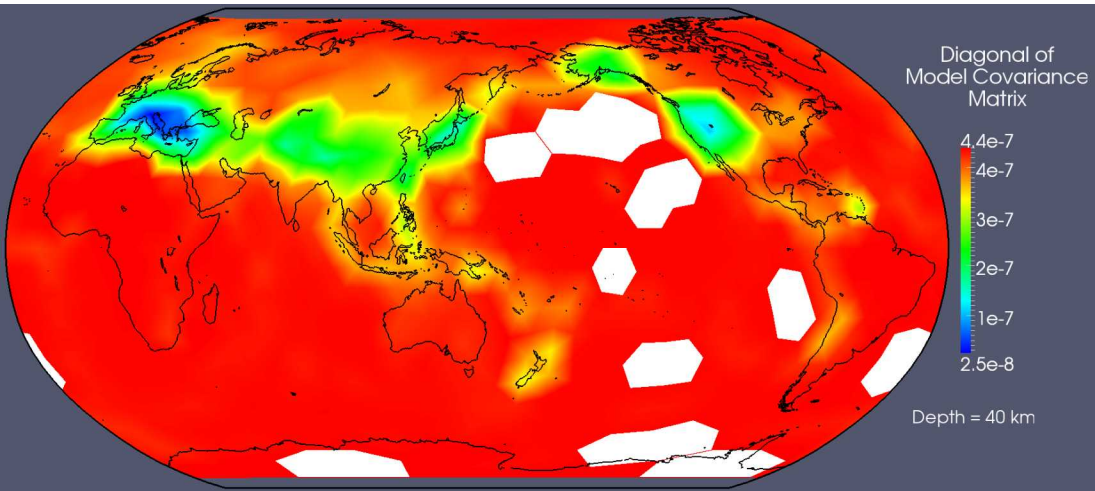


# Model Covariance Matrix

$$C_M = (G^T G)^{-1} G^T \begin{bmatrix} C_{\Delta d} & 0 \\ 0 & C_{\Delta s} \end{bmatrix} G (G^T G)^{-1}$$

15 petaflops to compute  
180GB of RAM to store  
computed in distributed mode

$$\sigma_T^2 = W \begin{bmatrix} C_M & 0 \\ 0 & C_{NR} \end{bmatrix} W^T$$

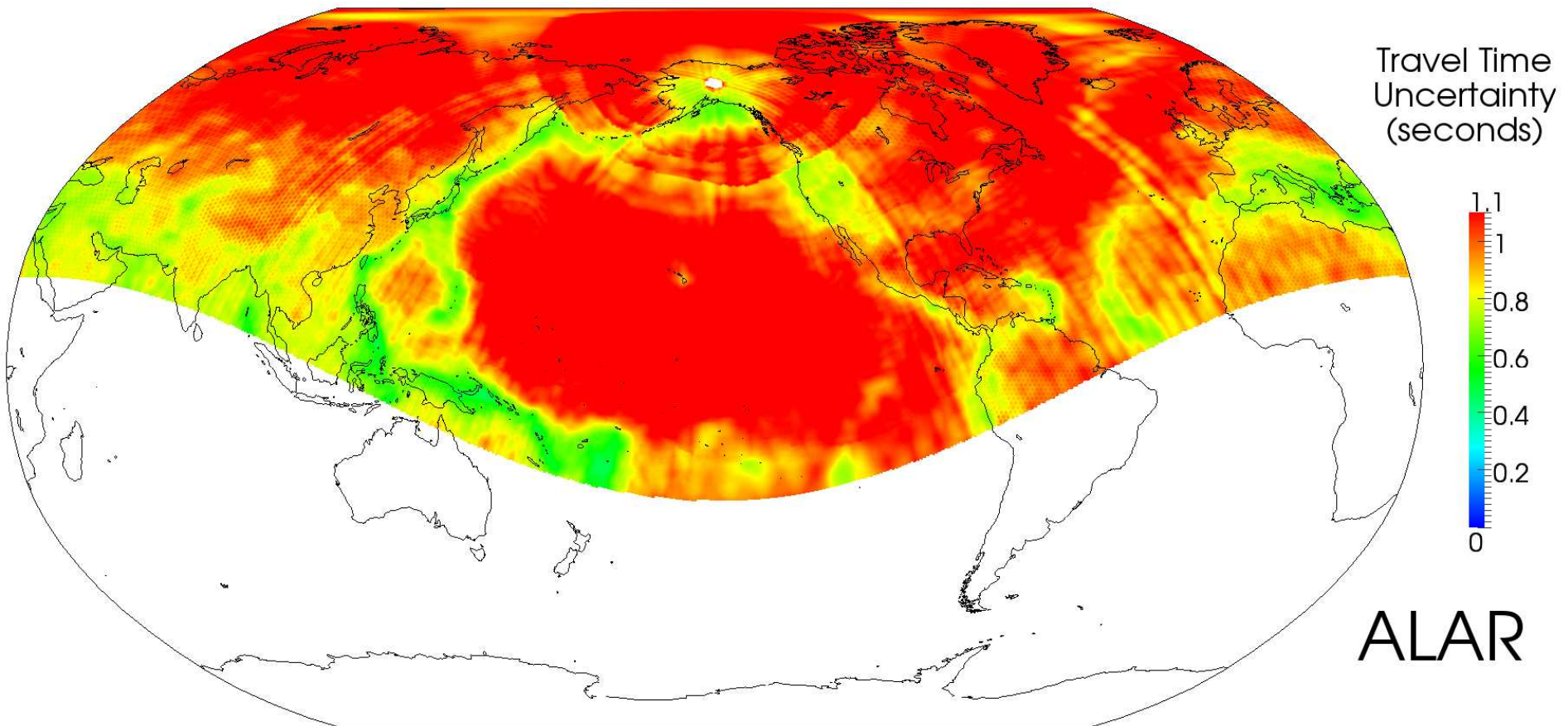


STEP 5  
UPPER MANTLE

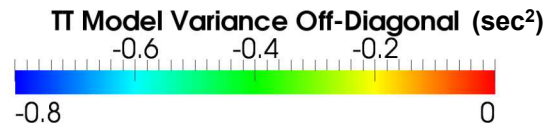
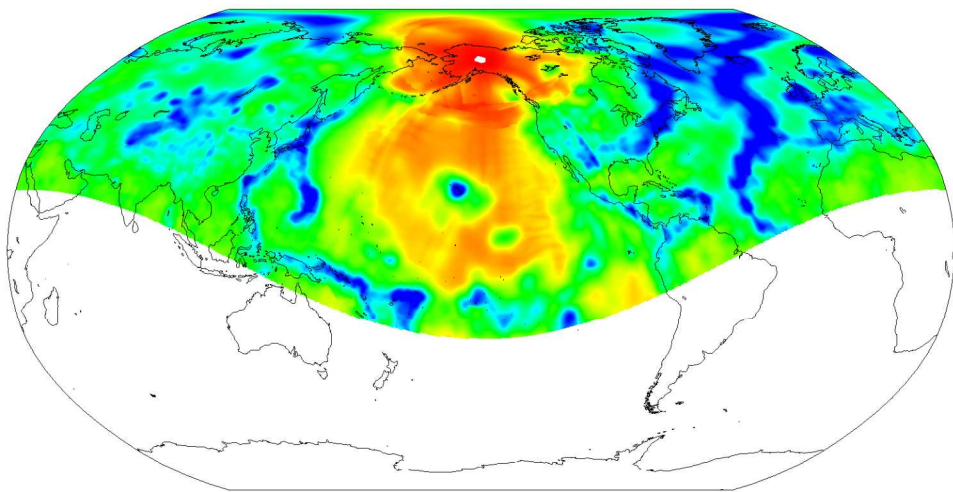
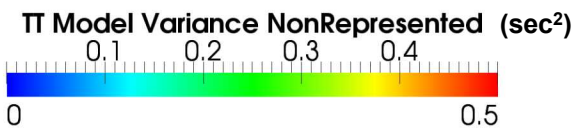
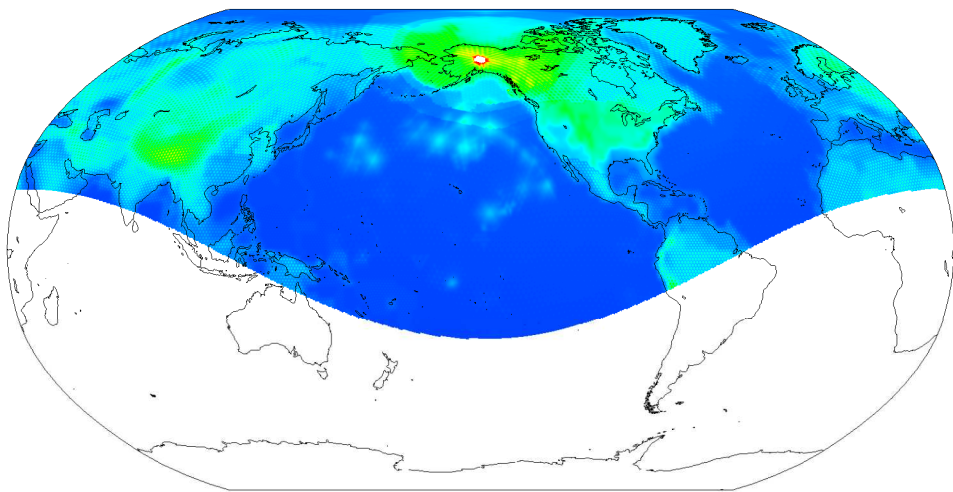
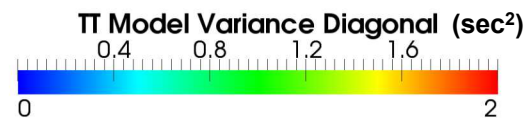
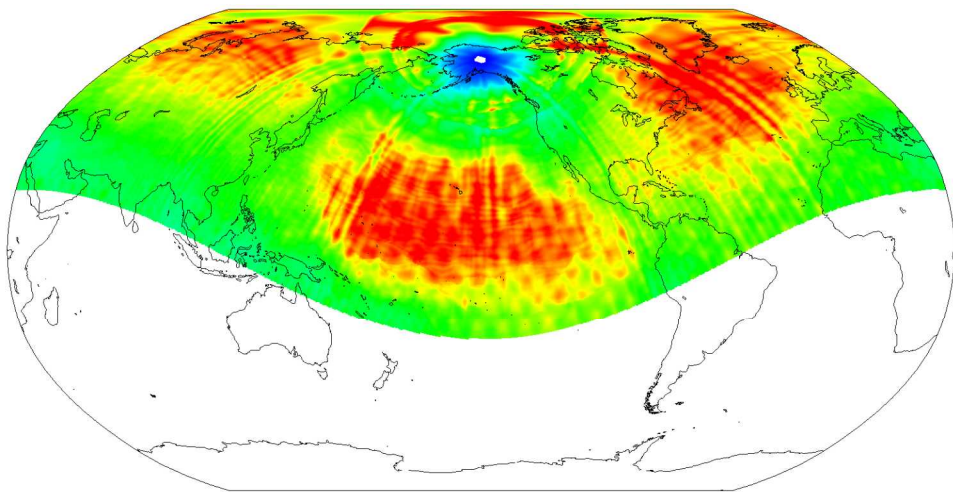
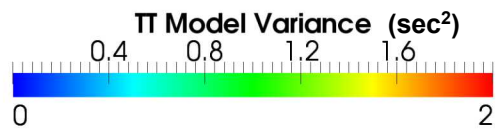
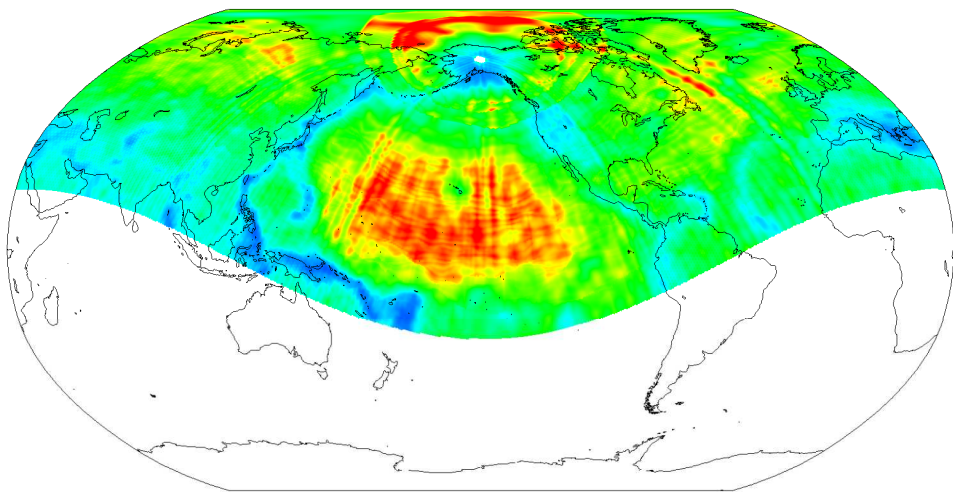


# Travel Time Uncertainty

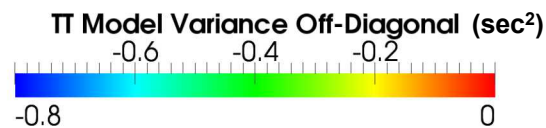
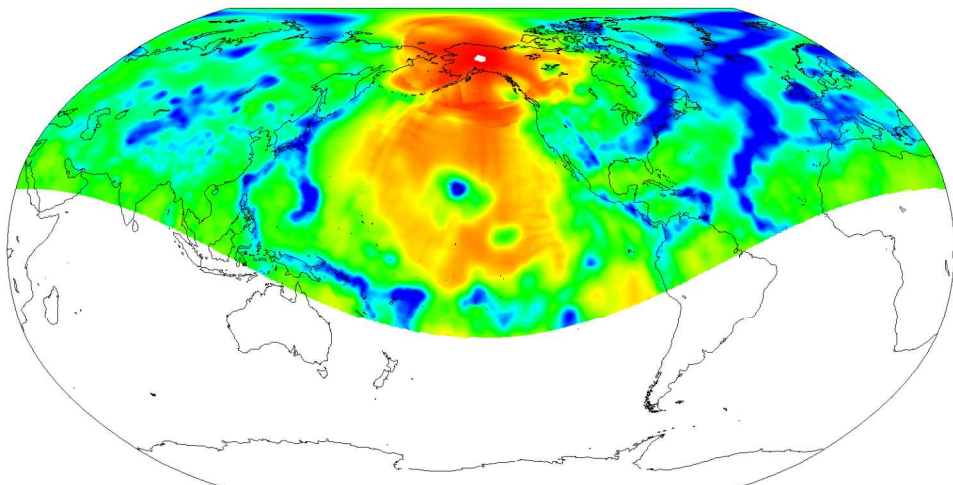
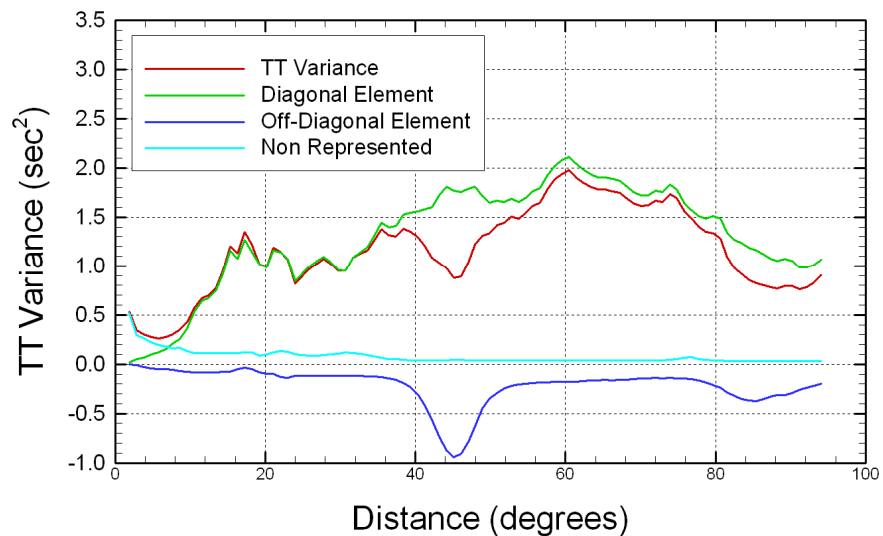
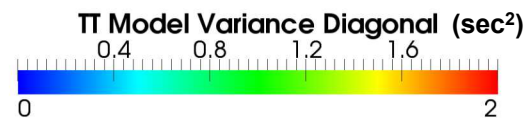
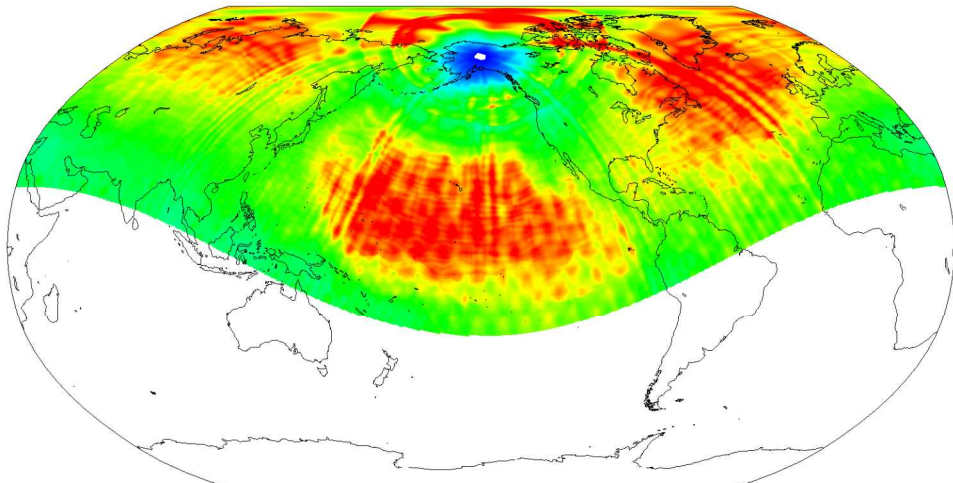
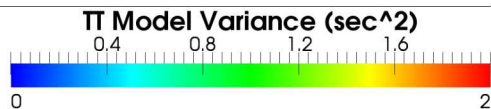
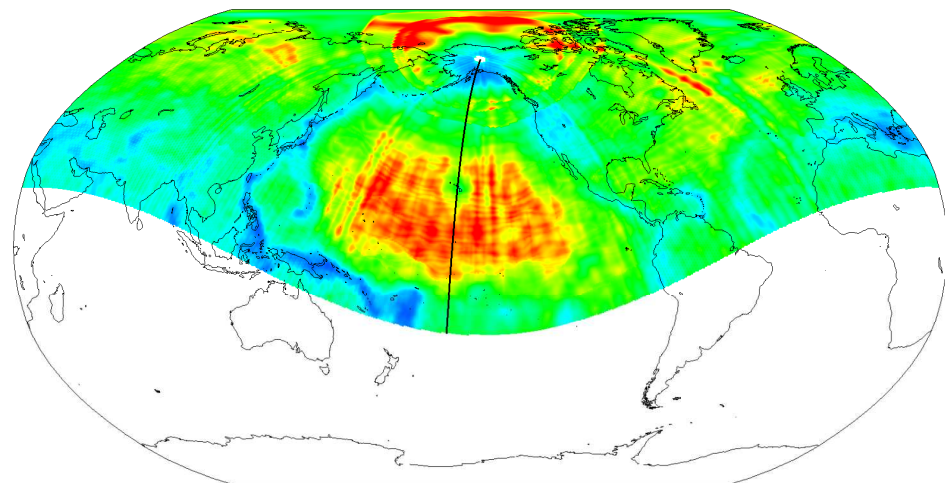
$$C_M = (G^T G)^{-1} G^T \begin{bmatrix} C_{\Delta d} & 0 \\ 0 & C_{\Delta s} \end{bmatrix} G (G^T G)^{-1} \quad \sigma_T^2 = W \begin{bmatrix} C_M & 0 \\ 0 & C_{NR} \end{bmatrix} W^T$$



# Model Covariance Matrix Decomposition

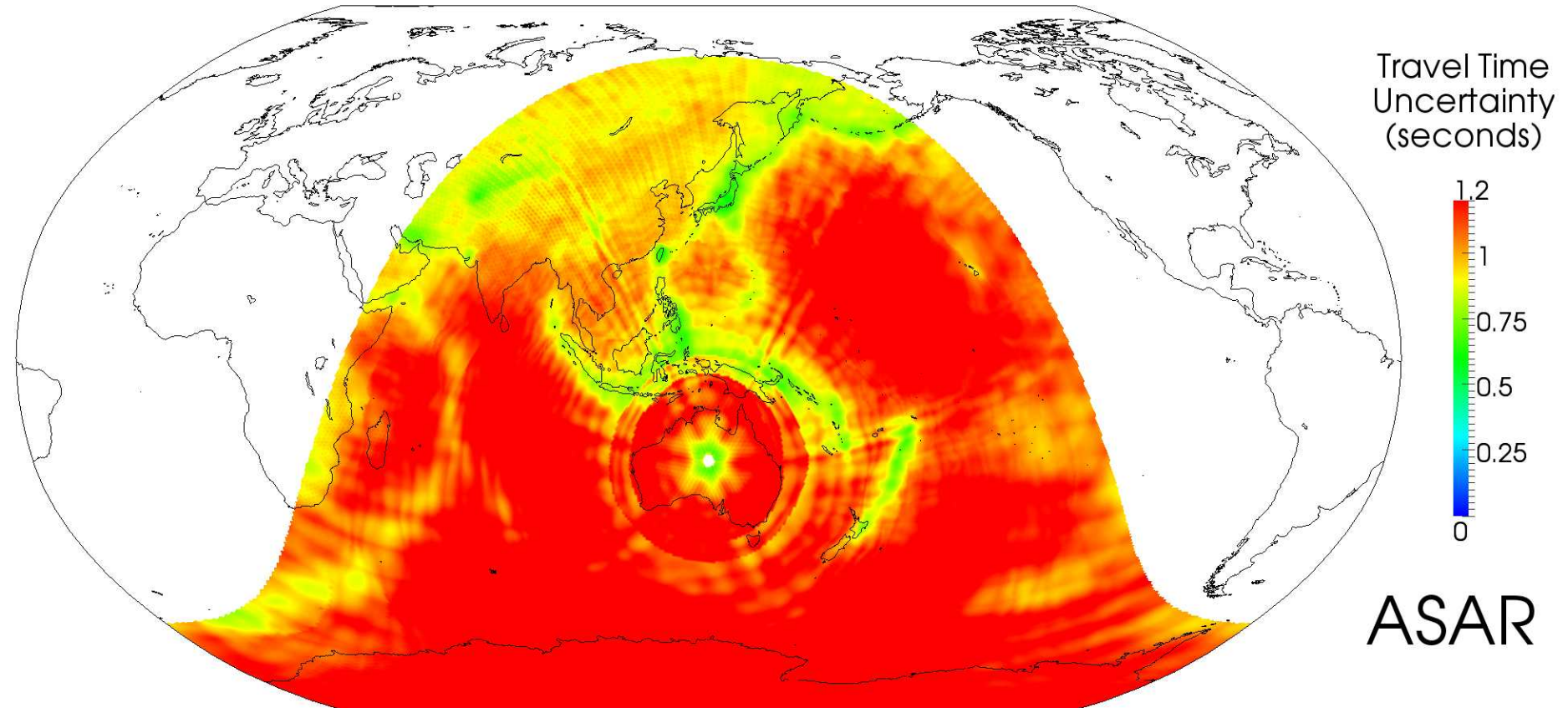


# Model Covariance Matrix Decomposition



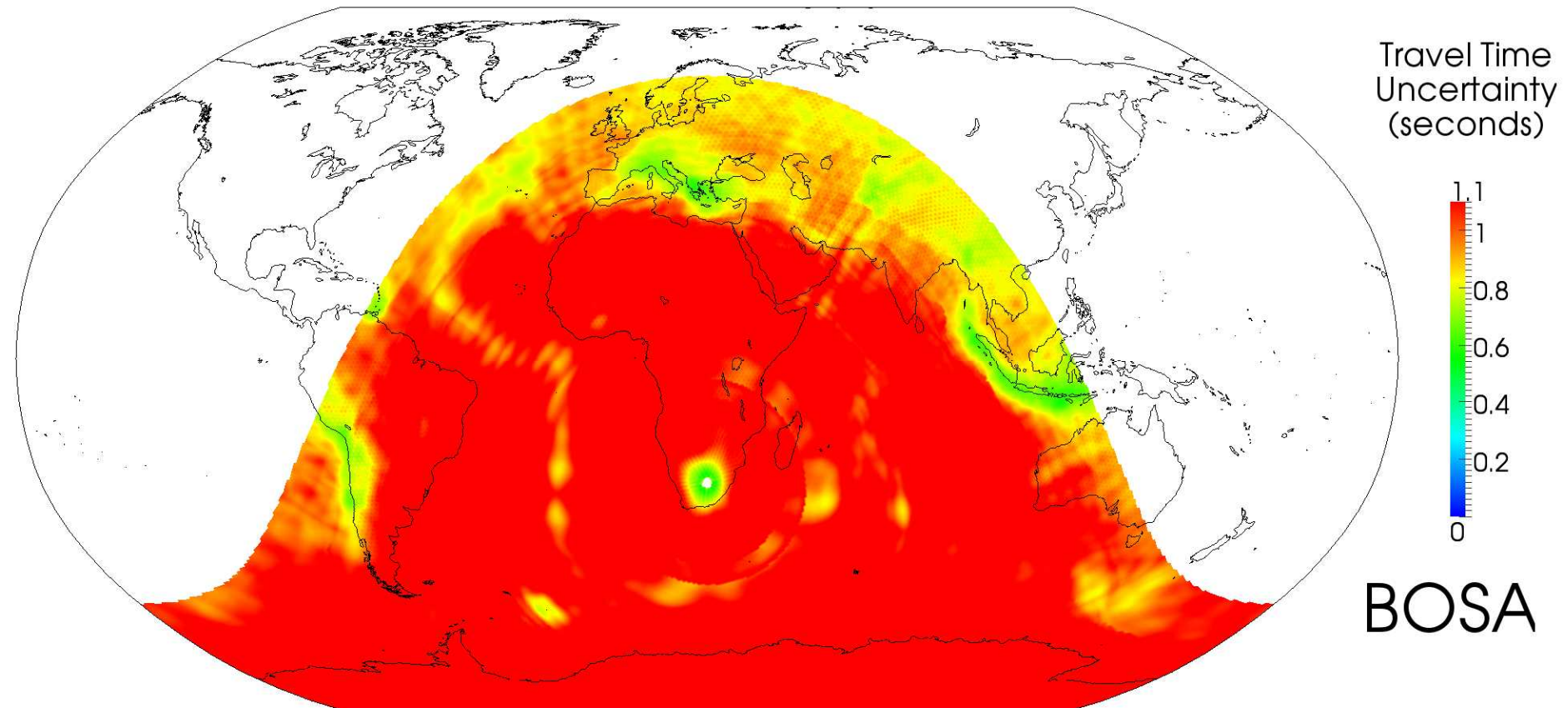
# Travel Time Uncertainty

$$C_M = (G^T G)^{-1} G^T \begin{bmatrix} C_{\Delta d} & 0 \\ 0 & C_{\Delta s} \end{bmatrix} G (G^T G)^{-1} \quad \sigma_T^2 = W \begin{bmatrix} C_M & 0 \\ 0 & C_{NR} \end{bmatrix} W^T$$



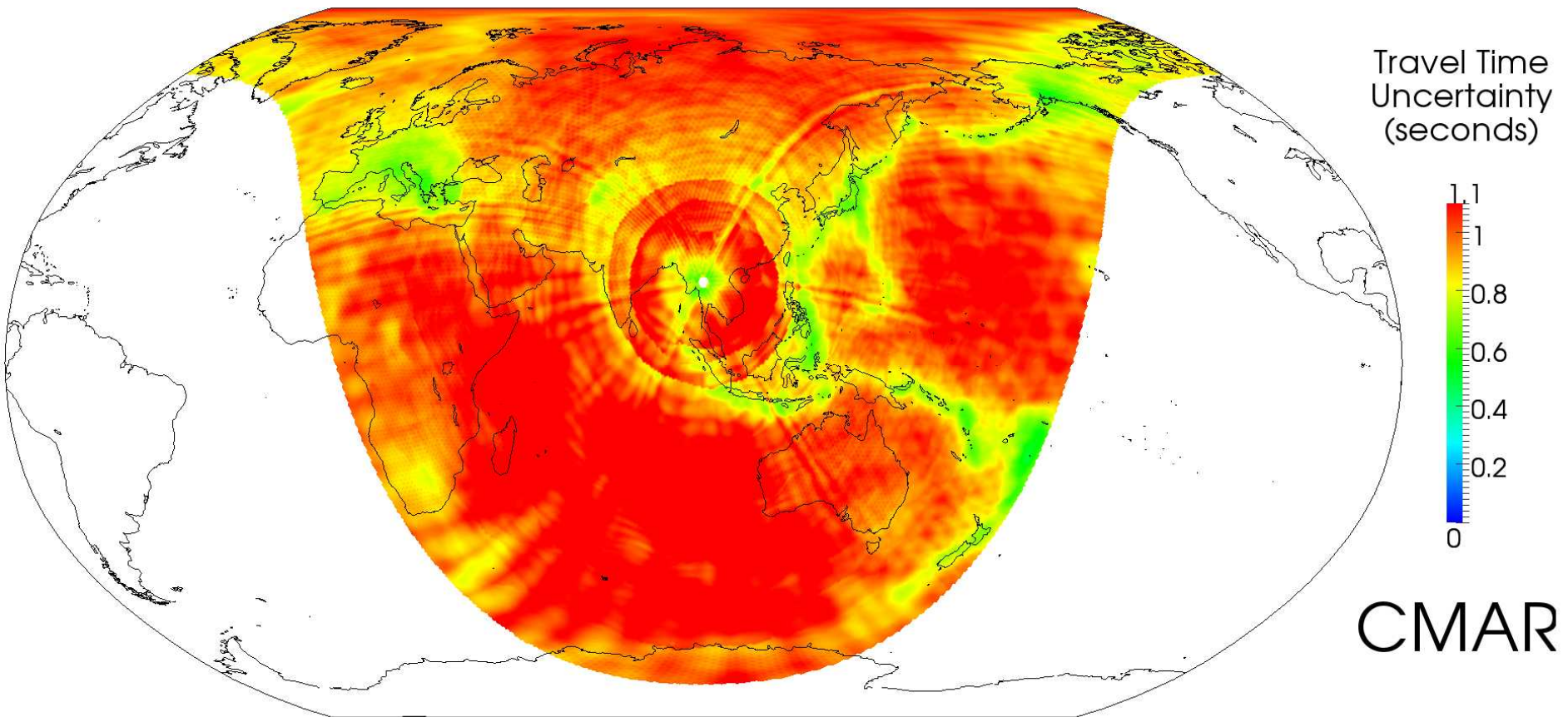
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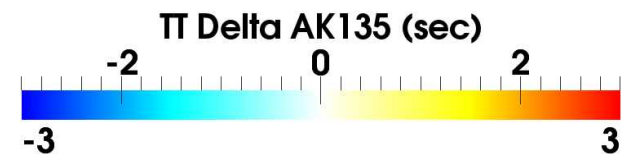
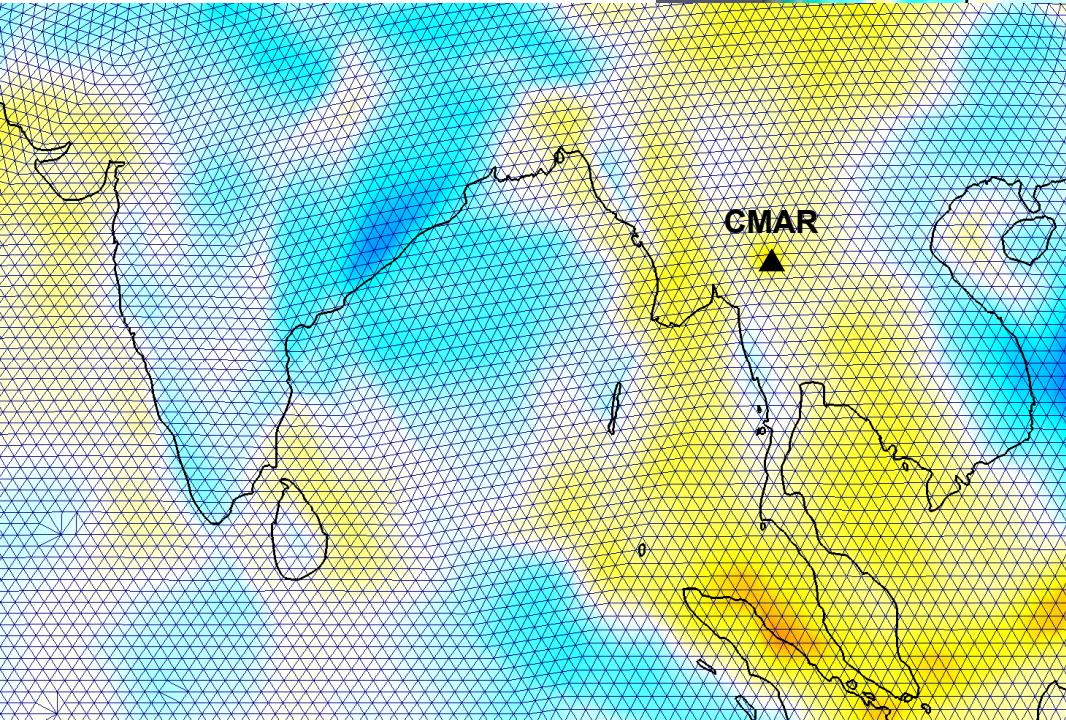
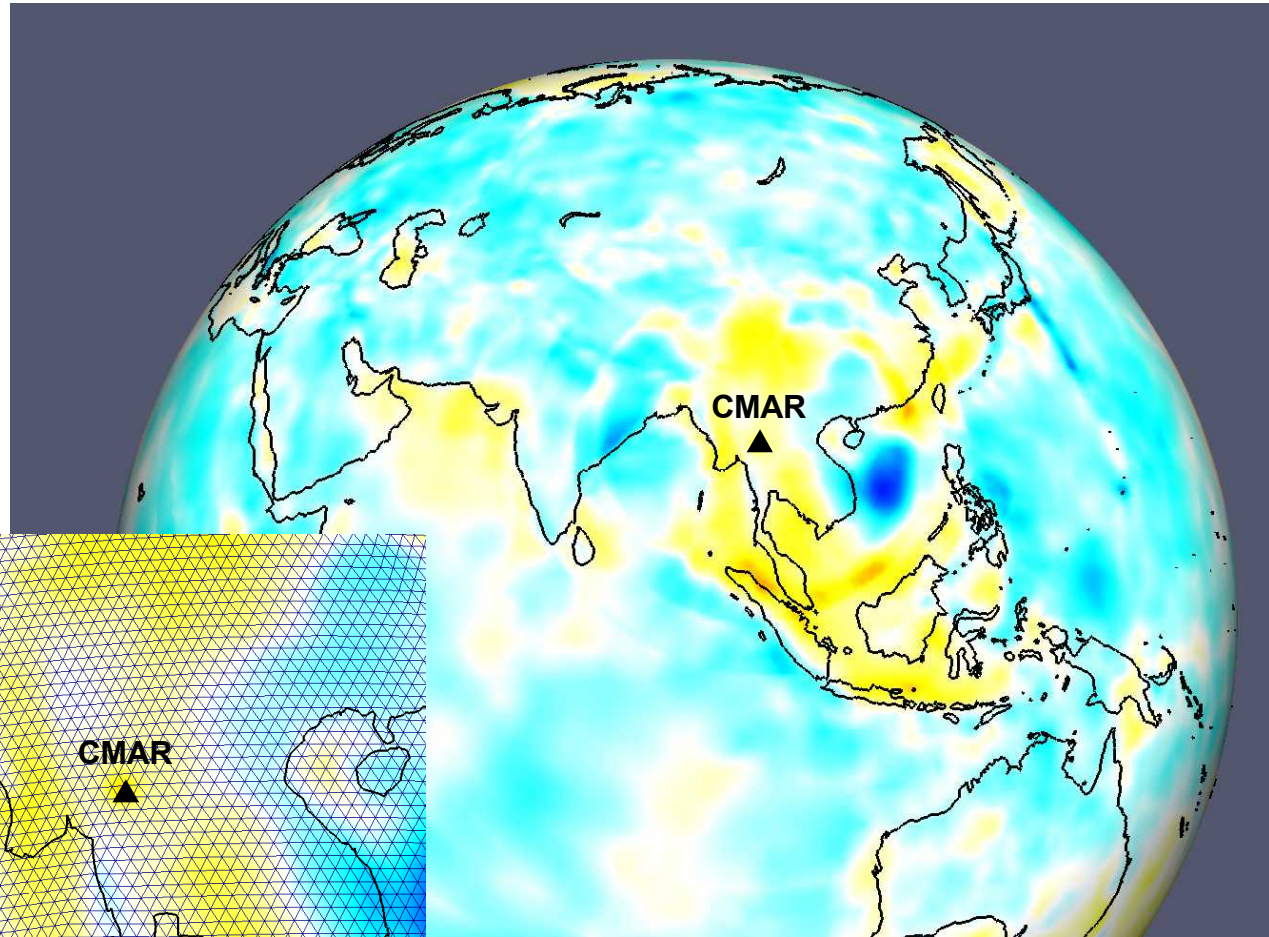
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# 3D Travel Time Lookup Tables

- TT relative to AK135:
  - 3D model
  - Empirical correction
- TT Uncertainty
- Derivatives



# Summary

- **The SALSA3D model is designed for improving travel time prediction.**
- **Data come from a dedicated location database produced from collecting existing GT events and mining the database for additional.**
  - Final observations are produced from clustering arrivals based on ray similarity.
- **Full Tomographic Procedure:**
  - Ray tracing before each iteration of LSQR,
  - Adaptive grid refinement using the model resolution matrix,
  - Relocation of original data using interim model,
  - Clustering and outlier removal,
  - Repeat of process from the beginning using the starting model
- **Travel time uncertainty calculated using the full model covariance matrix.**
  - Path dependent uncertainty

# Future Work

- **Further data quality control**
- **New phases: pP, PKP, S**
- **Simultaneous inversion: gravity, surface waves, etc.**
- **Calibration of travel time uncertainty**
- **Operationalization: Lookup tables**
  - Travel time, uncertainty, empirical corrections, derivatives