# Exploring Earth's deep interior with ambient noise and earthquake signals

Rob van der Hilst Massachusetts Institute of Technology

### Acknowledgments:

Scott Burdick (MIT), Huang Hui (MIT), Xuefeng Shang (MIT), Yao Huajian (now at USTC), Maarten de Hoop (Purdue University), Liu Qiyuan (Institute of Geology, China Earthquake Administration)

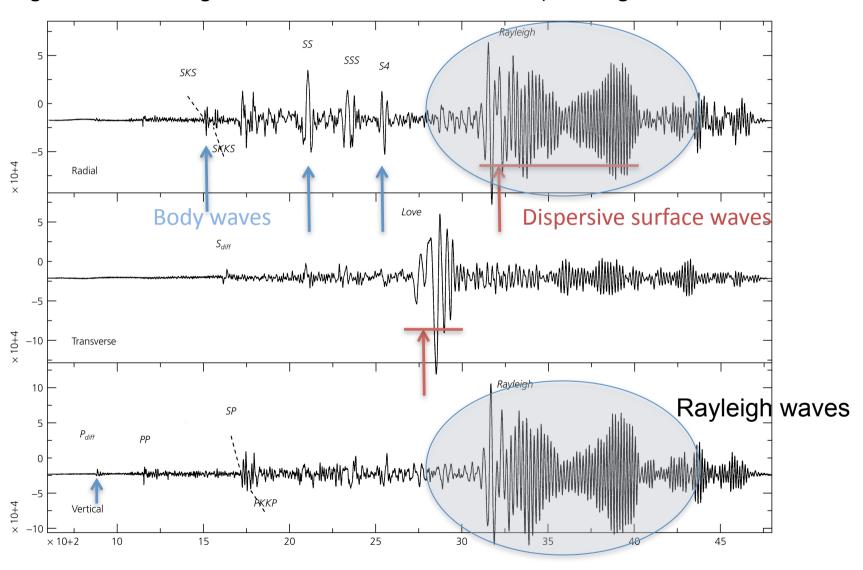
### Overview of lecture:

- 1.Introduction/background
- 2. Ambient noise and surface wave tomography
- 3. Reverse time migration of converted waves
- 4.Interferometry of teleseismic (coda) waves

Frequency	Mhz-kHz	10000-100Hz	100-10Hz	10Hz-1Hz	1-0.01Hz
Domain	Laboratory acoustics	Underwater acoustics	Shallow seismic imaging	Seismic imaging	Seismology- large scale
Applications	NDT  Monitoring	Tomography Source detection	Structure of shallow layers Geotechnical applications, land slides  Monitoring	Natural resources  Natural hazards  Monitoring	Structure of the Earth, Earthquake risk zonation, Monitoring
Wave type	elastic waves, also sound in water	Acoustic waves	Elastic waves	Elastic waves	Elastic waves
Propagation	Reverberant, andMultiple- Scattering	Weak scattering	Strong attenuation	Weak (crust) to strong (volcanoes) scattering	Weak scattering

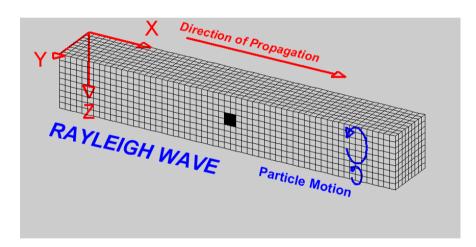
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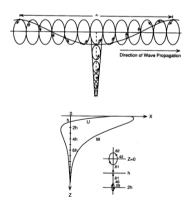
Figure 2.7-1: Seismograms recorded at a distance of 110°, showing surface waves.



'Surface and guided waves': waves trapped in the shallow layers or a wave guide (such as Love waves in the Earth, acoustic waves in the oceanic SOFAR, ....)

Also in elasticity the Rayleigh wave at the surface of an half-space

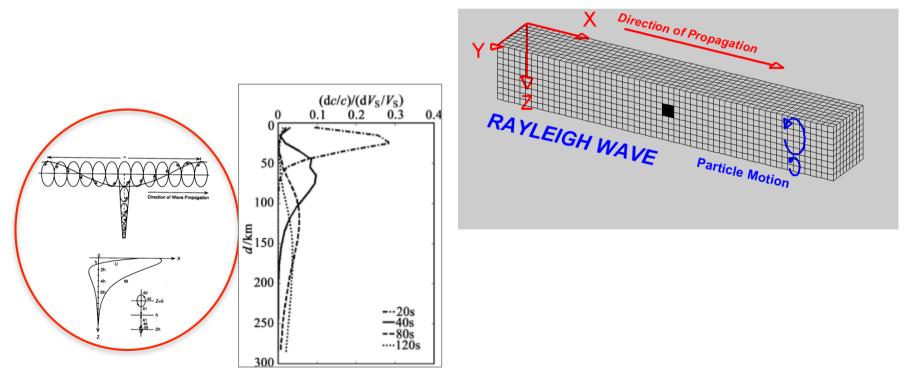




Eigenfunction

'Surface and guided waves': waves trapped in the shallow layers or a wave guide (such as Love waves in the Earth, acoustic waves in the oceanic SOFAR, ....)

Also in elasticity the Rayleigh wave at the surface of an half-space



frequency proxy for depth

Courtesy: Campillo (Cargese, 2011)

### **Traditional Approach to Tomography**

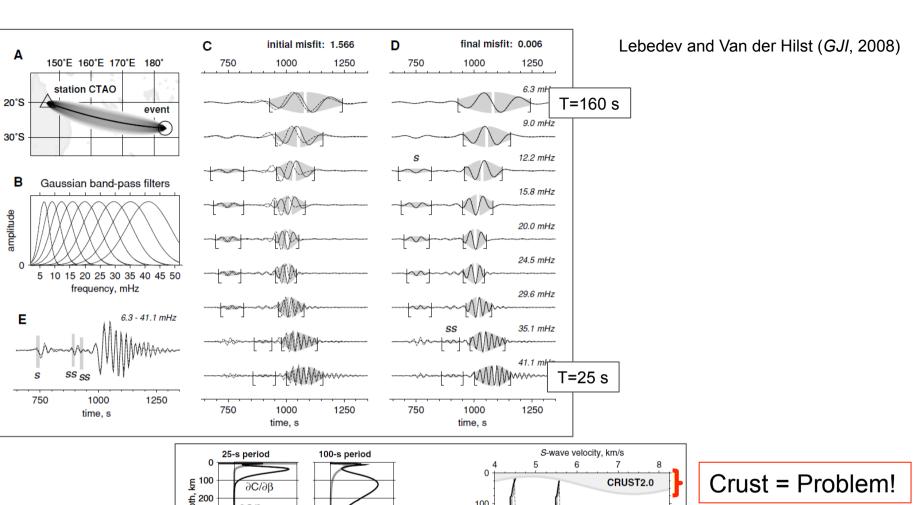
**DATA** (Massive Sensor Networks; Signal from Earthquakes)

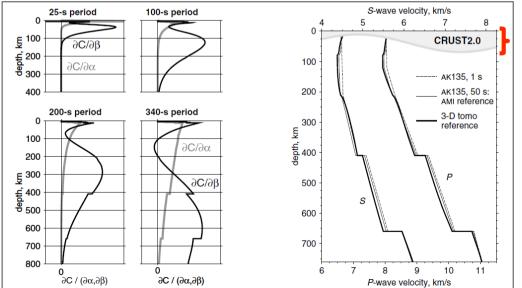
ballistic (source-to-receiver) wave propagation

### **Tomography**

(Asymptotic or Full-Wave) (Body waves, surface waves)

**3-D Velocity Model** that best explains data

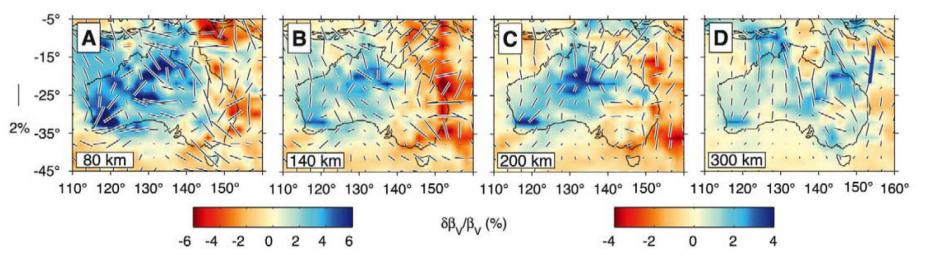


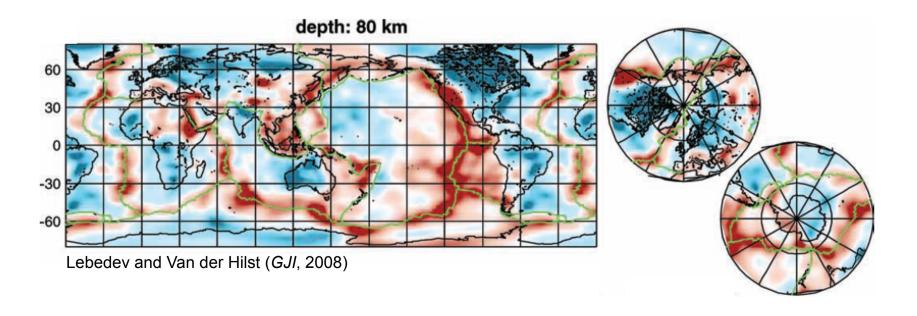


### Examples from traditional surface wave tomography with earthquake waves: relatively low frequencies $\rightarrow$ deep structures



 $T > 30 s \rightarrow upper mantle$ 





### **Ambient Noise Tomography**

**DATA** (Massive Sensor Networks; background noise)

Alternative: "sourceless" imaging/tomography

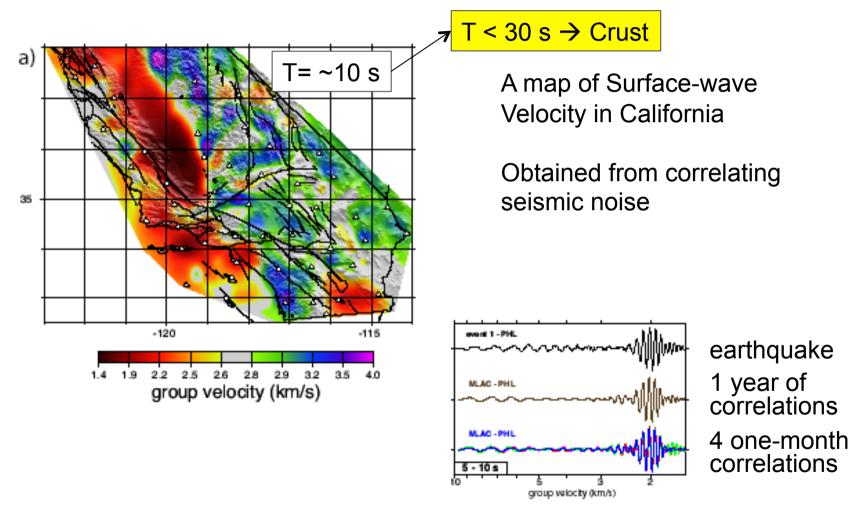
create data by means of interferometry/cross-correlation

### **Tomography**

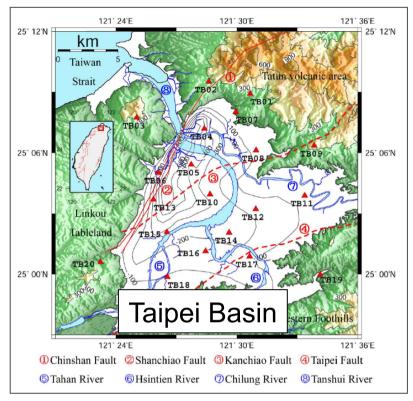
(Asymptotic or Full-Wave) (Body waves, surface waves)

**3-D Velocity Model** that best explains data

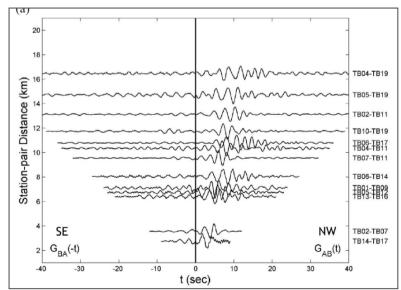
Shapiro, N.M., M. Campillo, L. Stehly, and M.H. Ritzwoller, 2005, High-Resolution Surface-Wave Tomography from Ambient Seismic Noise: Science **307**:1615-1618

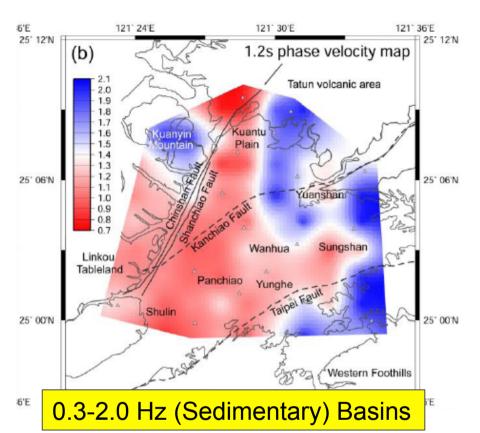


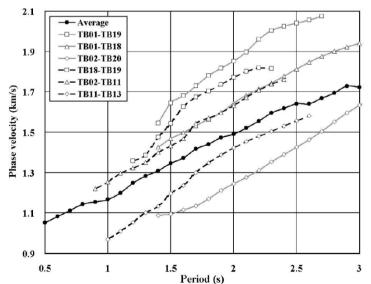
also Sabra, et al Surface wave tomography from microseisms in Southern California Geophys Res Lett **32** (2005)



Huang et al. (BSSA, 2010)

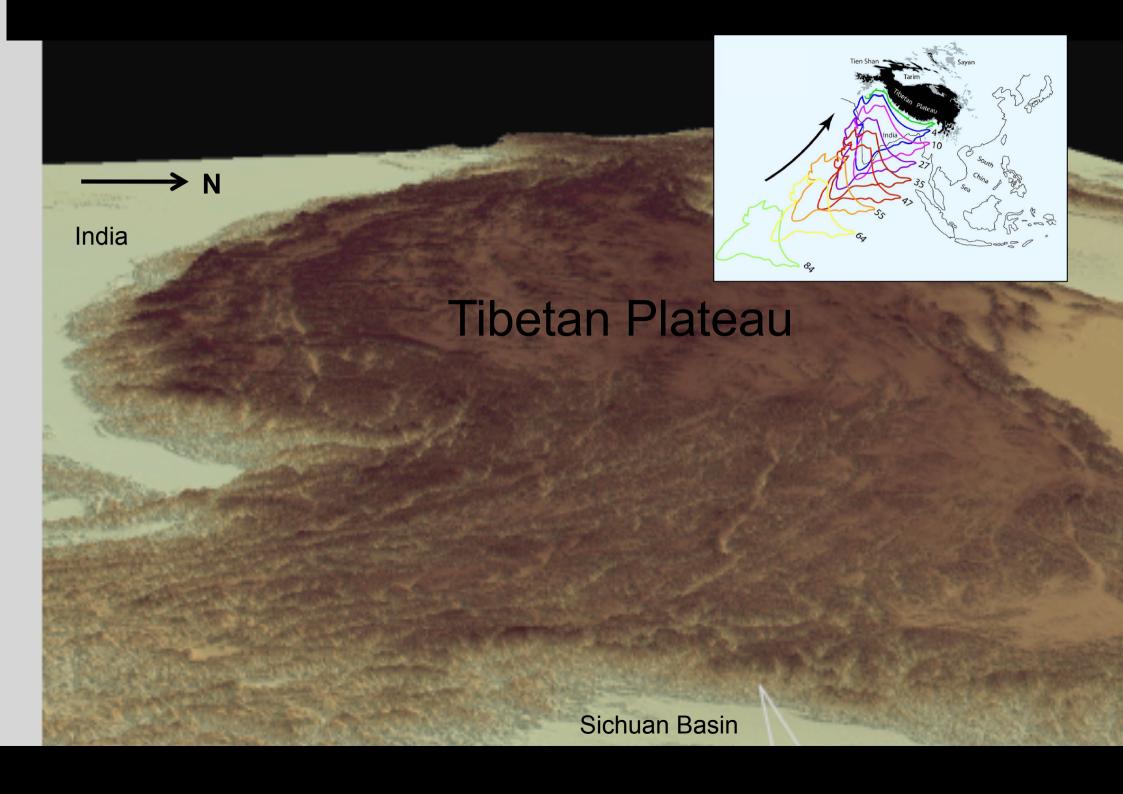


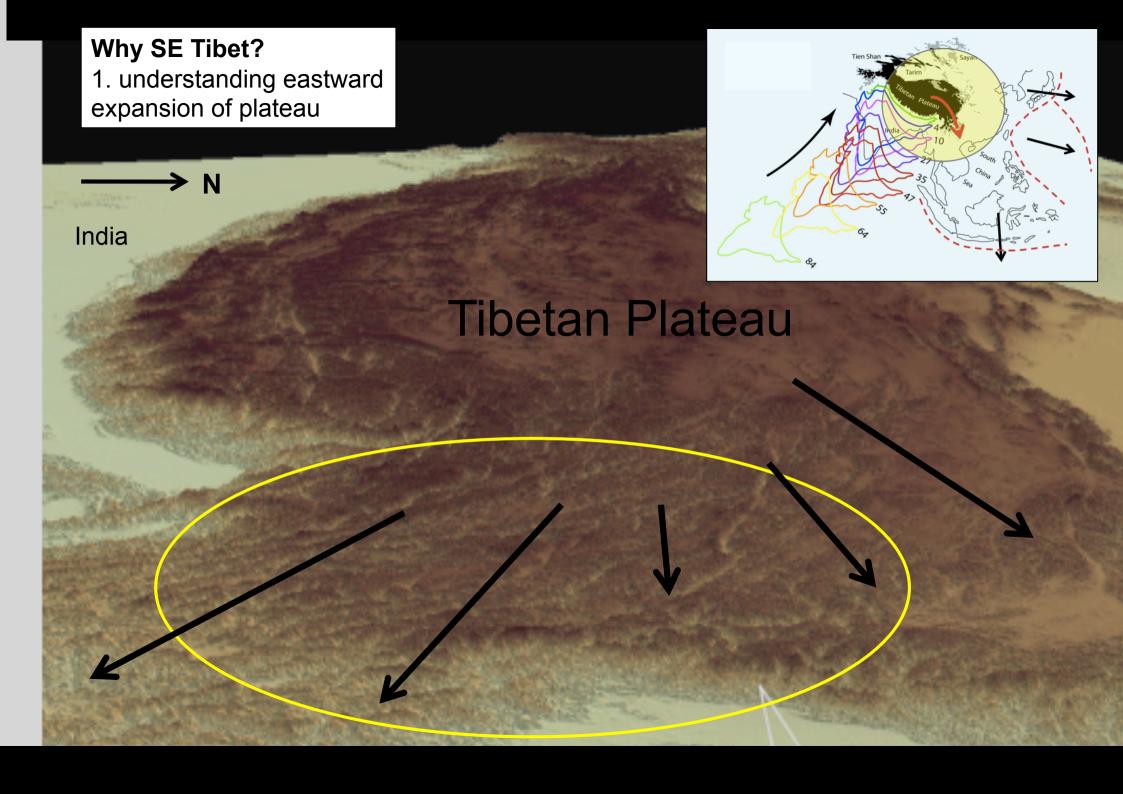


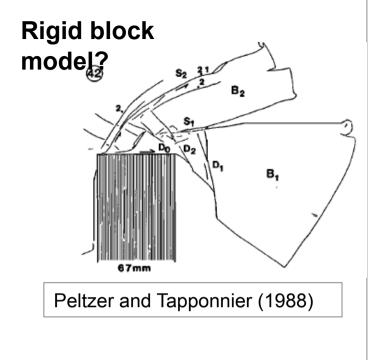


Frequency	Mhz-kHz	10000-100Hz		100-10Hz	10Hz-1Hz	1-0.01Hz		
Domain	Laboratory acoustics	Und		Bound	daries are b	lurring		
Applications	NDT  Monitoring	Sou	broader frequency bandwidth → larger depth rang (when arrays are available)  Surface geology ↔ Deeper dynamic processes					
Wave type	elastic waves, also sound in water	Acoustic waves		Elastic waves	Elastic waves	Elastic waves		
Propagation	Reverberant, andMultiple- Scattering	Weak scattering		Strong attenuation	Weak (crust) to strong (volcanoes) scattering	Weak scattering		

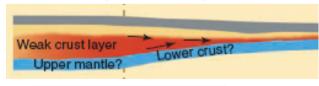
# Field Projects Sichuan & Yunnan Provinces and E. Tibet (2003-2004) Crust-Mantle study E Tibet – SW China Tibetan Plateau 29 Lehigh array 25-MIT array





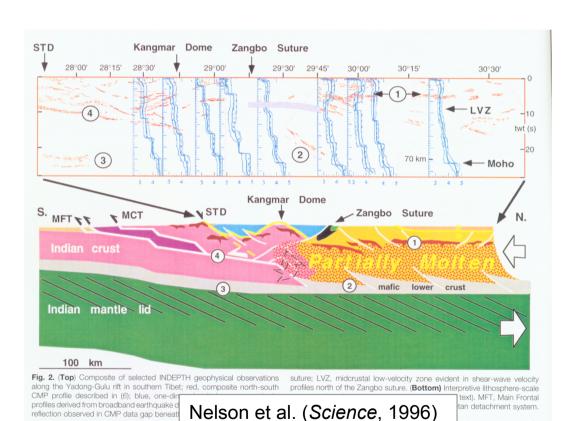


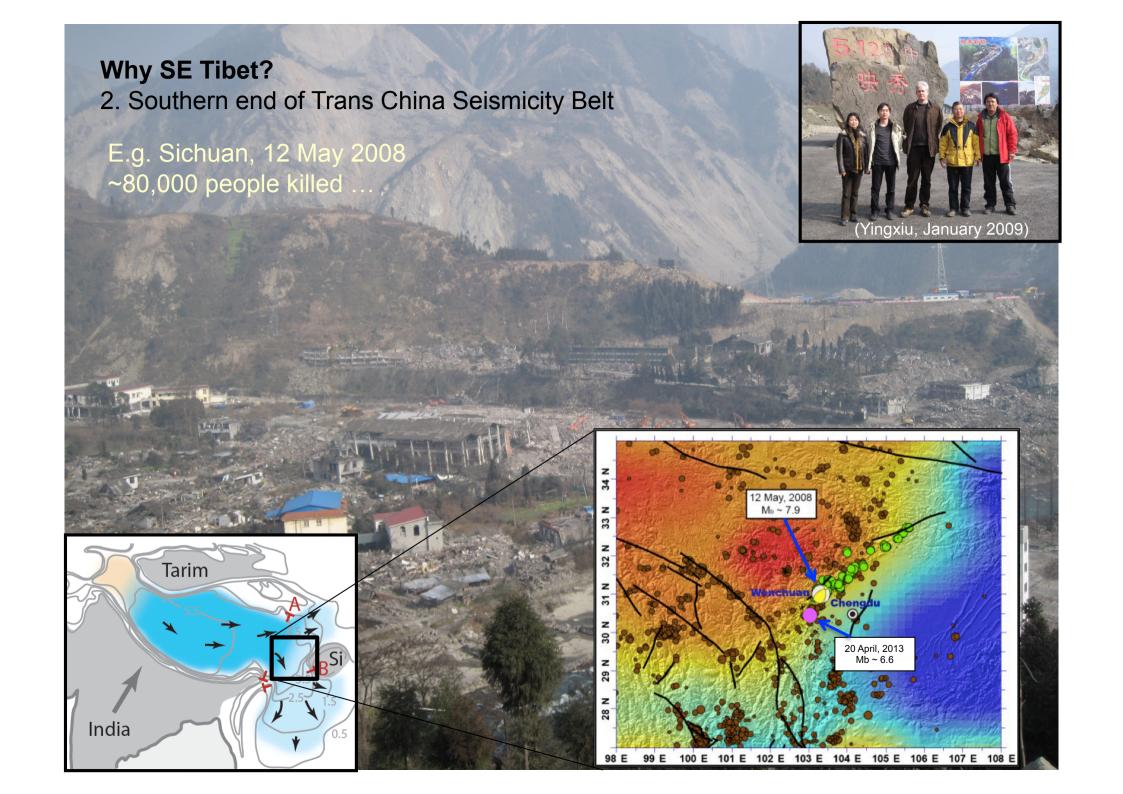
#### Crustal (channel) flow?



Royden et al. (1996)

# How does this work? Rigid blocks? Crustal flow? Need to know structure of the crust!





### Overview of lecture:

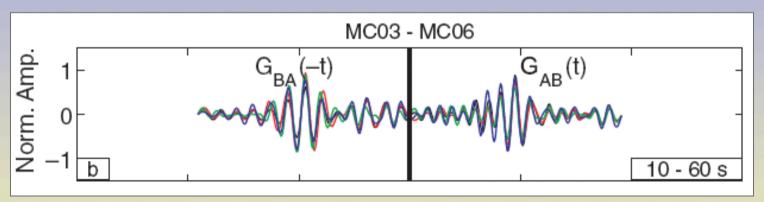
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### Interferometry:

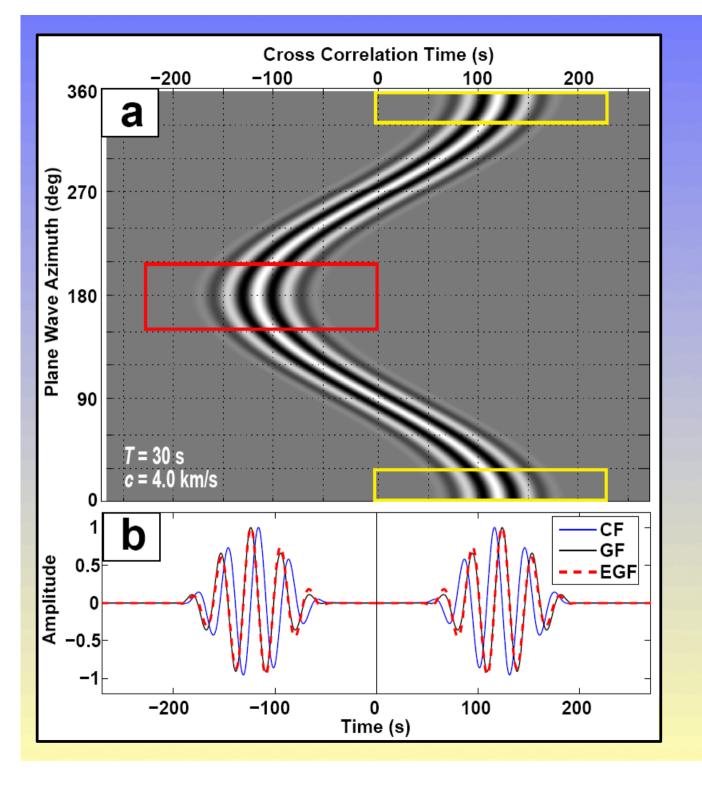
## long-term noise correlation → new data for crustal tomography

$$\frac{dC_{AB}(t)}{dt} \approx -\hat{G}_{AB}(t) + \hat{G}_{BA}(-t) \approx -G_{AB}(t) + G_{BA}(-t).$$

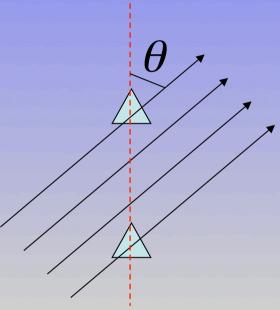
G = Green's function



Yao et al. (GJI, 2006)



Recovery of surface waves (2D case)



Homogen. + iso medium

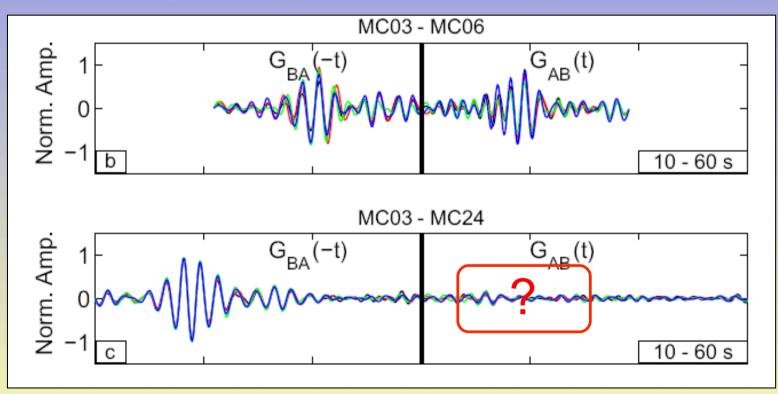
isotropic incident plane wave

Yao & Van der Hilst (2009)

### **Interferometry:**

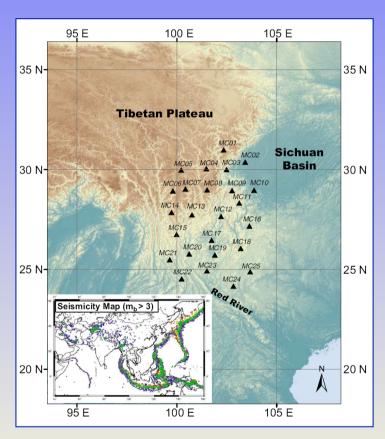
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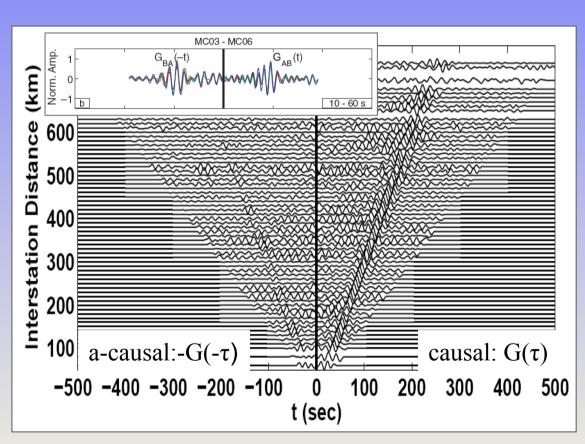
(simple in concept, but devil is in the detail ...)



Yao et al. (GJI, 2006)

### Crust and Lithosphere: Multi-resolution surface wave tomography

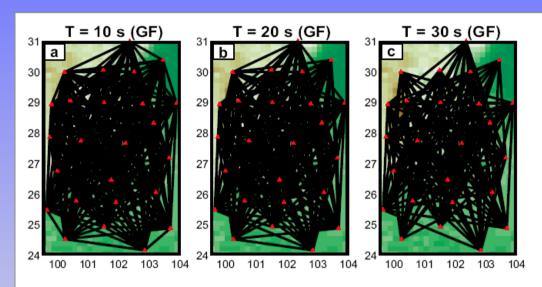




Seismic interferometry → estimate data from background "noise"

(NB we ignore asymmetry and sum causal and a-causal signals)

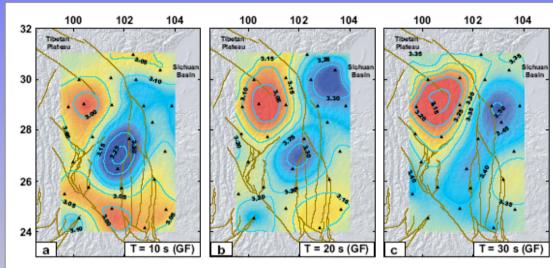
#### **Example: "ambient noise" surface wave tomography**



"source"-receiver pairs at different periods

Interferometry (scattering) → works well for relatively short periods (high frequency)

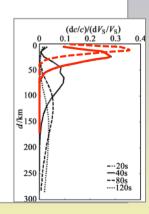
### **Example: "ambient noise" surface wave tomography**



Phase velocity maps at different periods

Interferometry (scattering) → relatively short periods (high frequency)

For surface wave tomography that means: "shallow" sub-surface



### Use both 'active' and 'passive' data

**DATA** (Massive Sensor Networks; earthquakes AND background noise)

ballistic (source-to-receiver) wave propagation

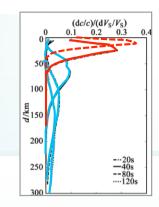
create data by means of interferometry/cross-correlation

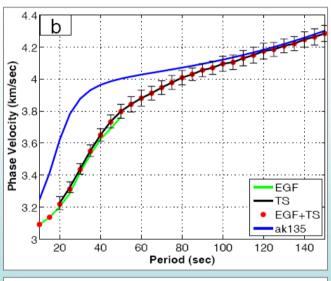
### **Tomography**

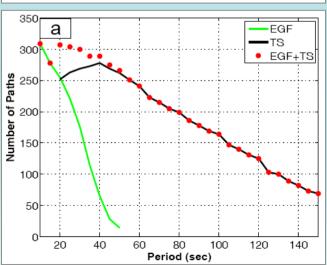
(Asymptotic or Full-Wave) (Body waves, surface waves)

3-D Velocity Model that best explains data

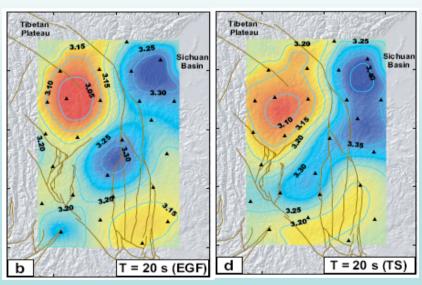
### Combination of ambient noise and earthquake data: extend frequency range → extend depth range





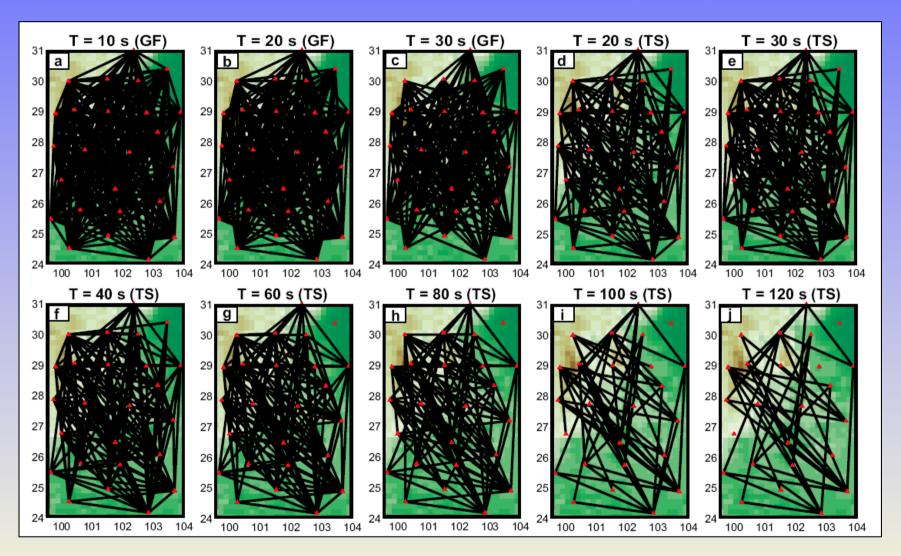


At overlapping periods, Rayleigh wave phase velocities from EGF (from 10 months Z-comp. data) and TS analyses are similar



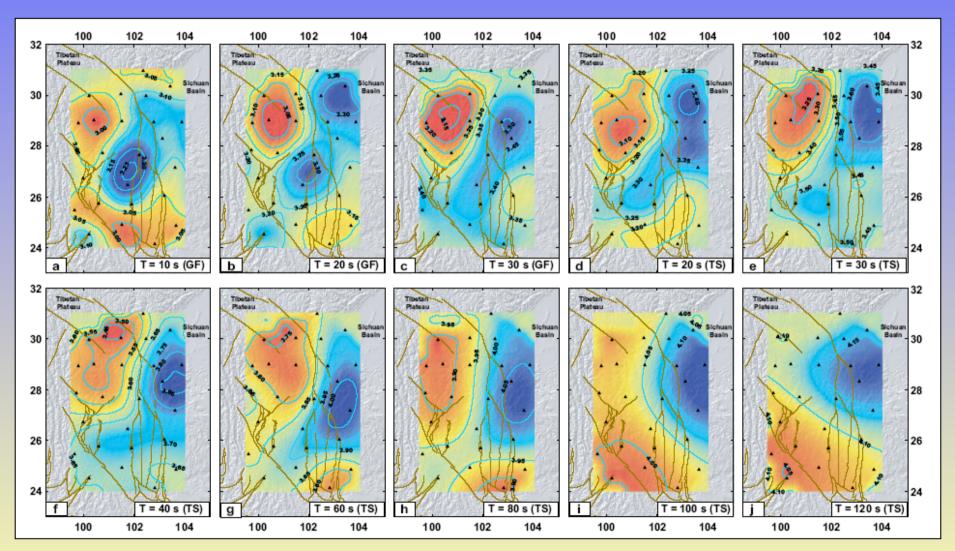
- TS slightly higher (< 0.7%) due to differences in finite frequency effect
- Difference << medium perturbations (< 10%)</li>

### **Multi-resolution surface wave tomography**



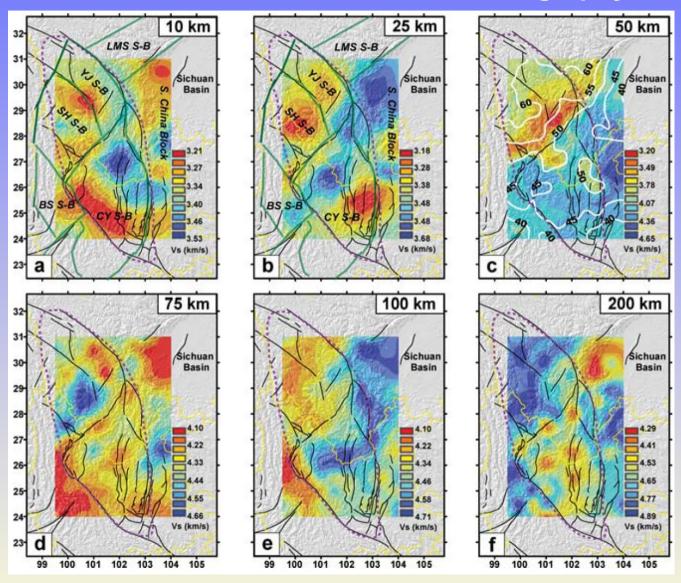
Yao, Van der Hilst, and De Hoop (GJI, 2006)

### Phase velocity maps at different periods



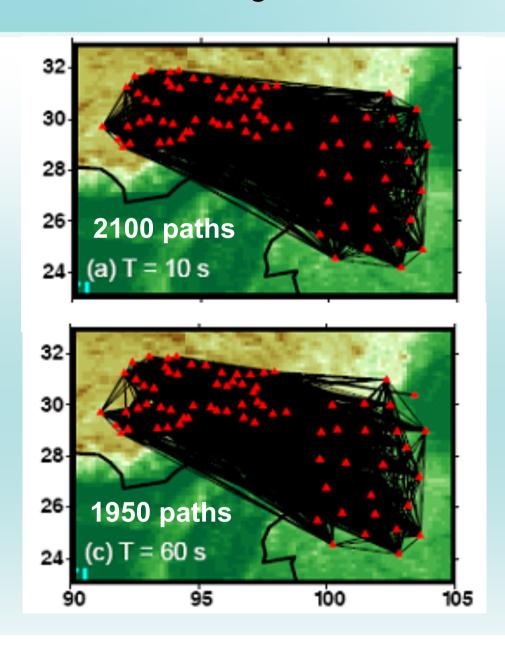
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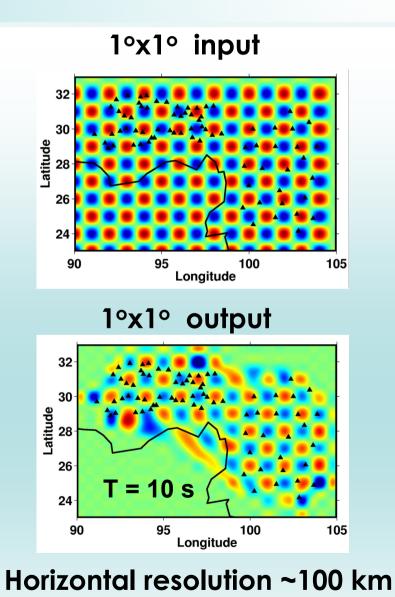
### **Multi-resolution surface wave tomography**



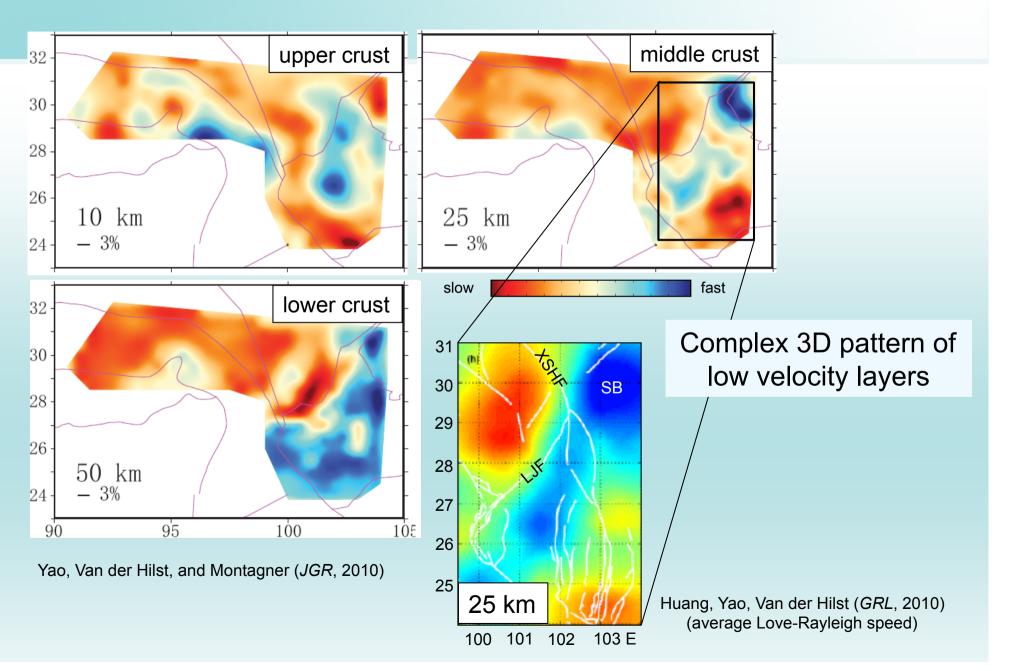
Yao, Beghein, and Van der Hilst (GJI, 2008)

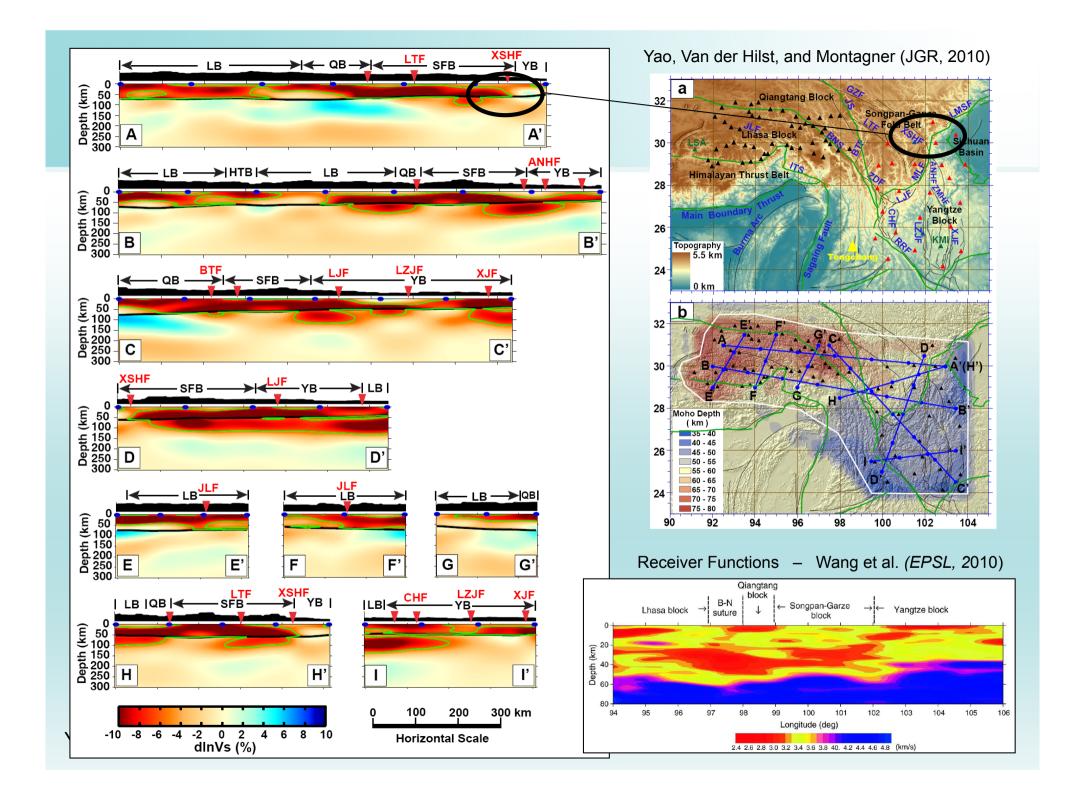
#### Path coverage and lateral resolution of phase velocity maps





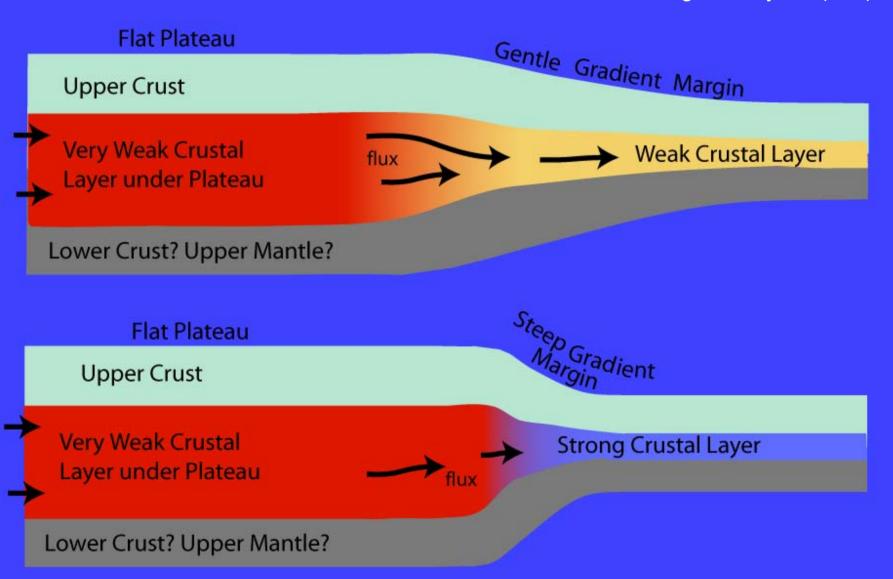
### Crustal wavespeeds in SE Tibet and Sichuan Province (from Ambient Noise – Rayleigh wave – tomography)



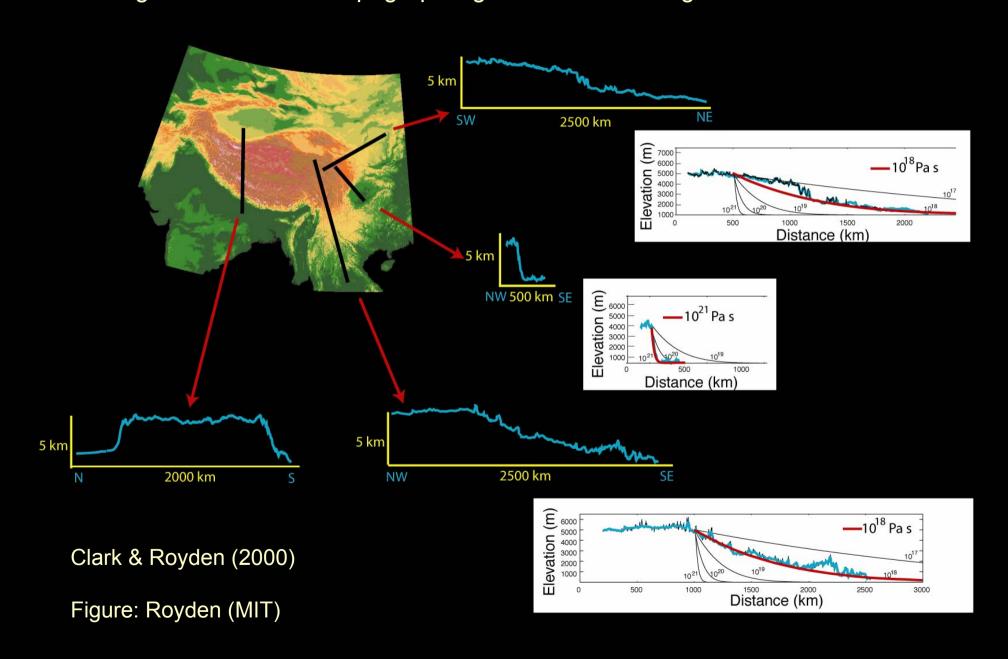


Topographic gradients on plateau margin reflect the strength (effective viscosity) of the weakest layer in the underlying crust

Figure: Royden (MIT)



#### Regional variation in topographic gradient at the margins of the Tibetan Plateau



# **Anisotropy I: Azimuthal Anisotropy**

(i.e., dependence of wavespeed on direction of propagation in horizontal plane)

 Step 1: inter-station phase velocities from EGF → azimuthally anisotropic phase velocity maps

$$c(\omega,\psi) = c_0(\omega)[1 + a_0(\omega) + a_1(\omega)\cos 2\psi + a_2(\omega)\sin 2\psi]$$

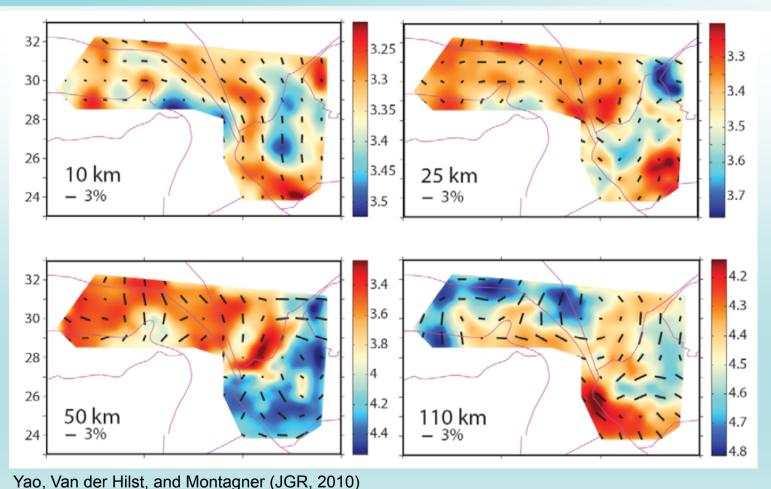
Step 2: phase velocity maps → shear wave speed & anisotropy

$$\delta c_R(x, y, \omega, \psi) \approx \int_0^H \left[ \frac{\partial c_R}{\partial L} \left( \delta L + G_c \cos 2\psi + G_s \sin 2\psi \right) \right] \frac{dz}{\Delta h}$$

At each point (x,y), the reference crustal thickness is constrained from receiver functions (Xu et al., 2007; Zurek et al, 2005)

$$\hat{\beta}_{SV} \approx \beta_{SV} \left( 1 + \frac{G_c}{2L} \cos 2\psi + \frac{G_s}{2L} \sin 2\psi \right)$$
Transverse isotropic  $V_{SV}$ : 
$$\beta_{SV} = \sqrt{\frac{L}{\rho}}$$
Magnitude of azimuthal aniso  $A_{SV} = \frac{1}{2L} \sqrt{\left(G_c\right)^2 + \left(G_s\right)^2}$ 
Fast axis of azimuthal aniso : 
$$\phi = \frac{1}{2} \tan^{-1} \left(G_s / G_c\right)$$

# 3D lithospheric heterogeneity & azimuthal anisotropy

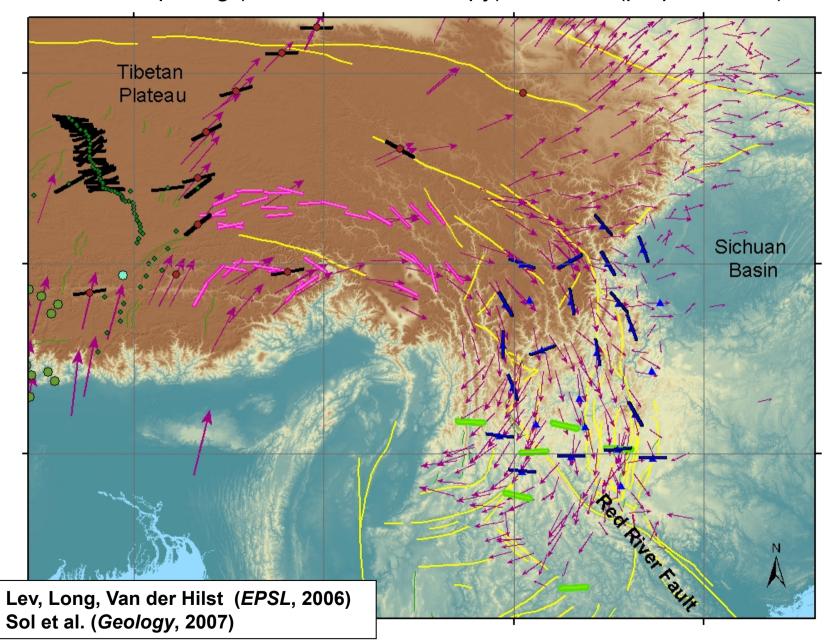


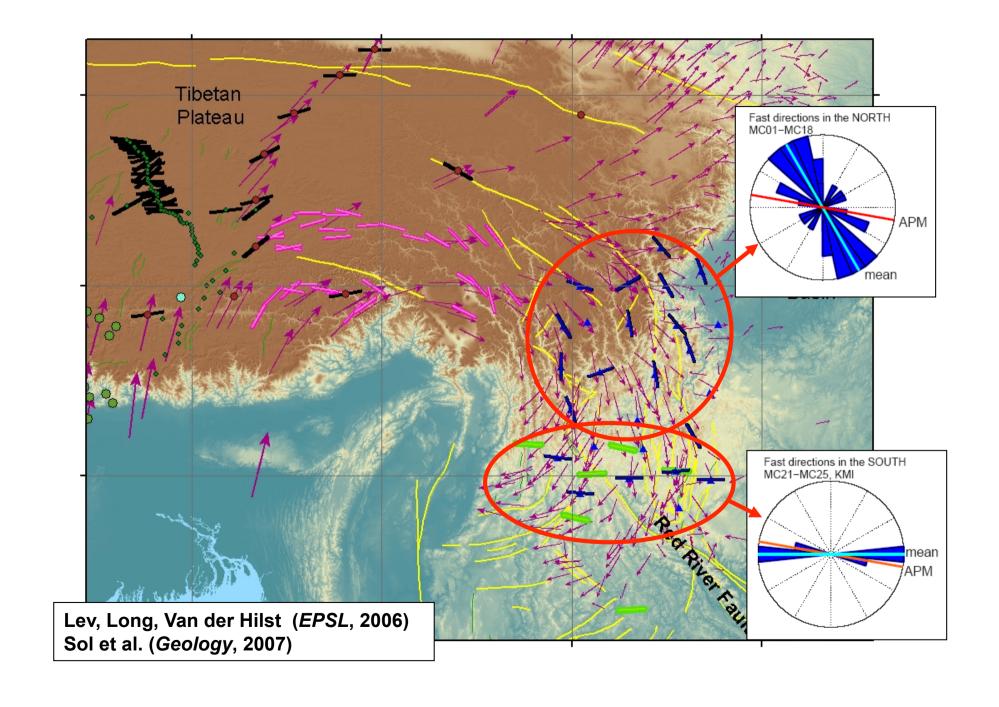
Complicated deformation pattern:

Upper crust: consistent with clockwise rotation (GPS)

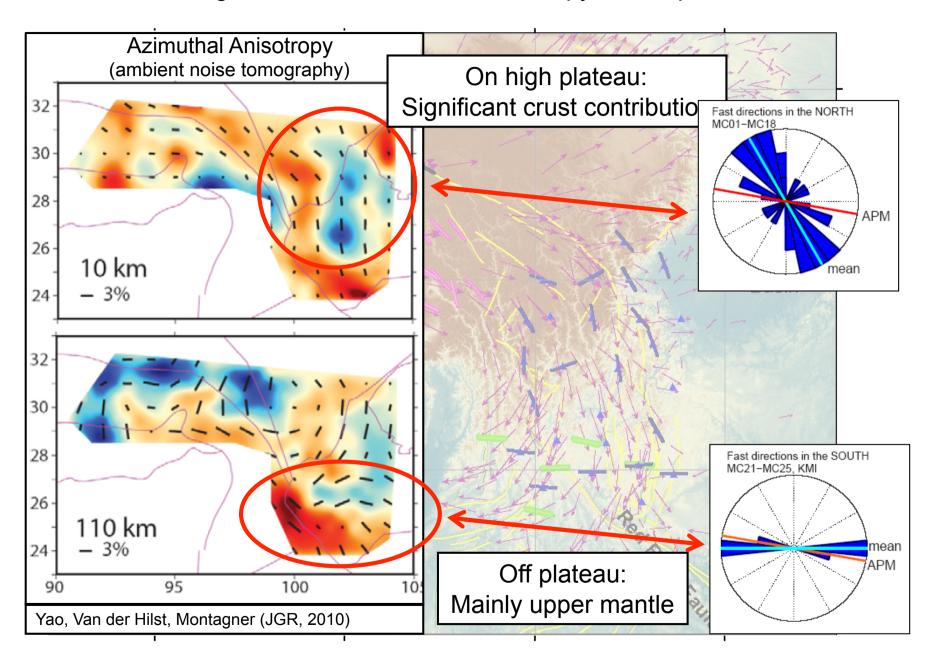
Uppermost mantle: fast direction along the LVZ of the margin of Yangtze block

SKS splitting (~ azimuthal anisotropy) and GPS (purple arrows)

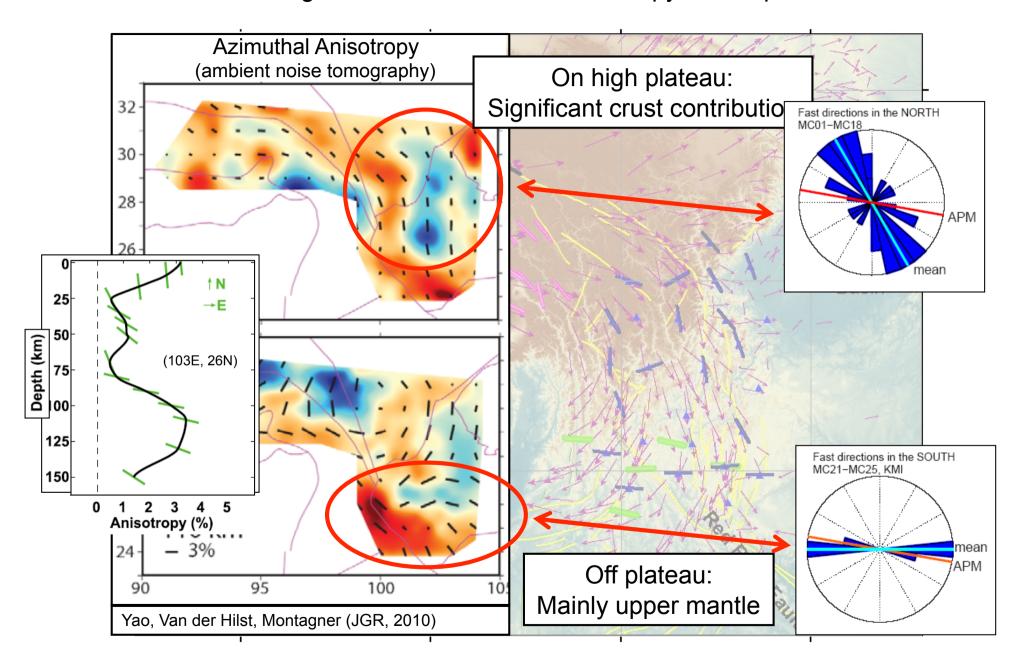




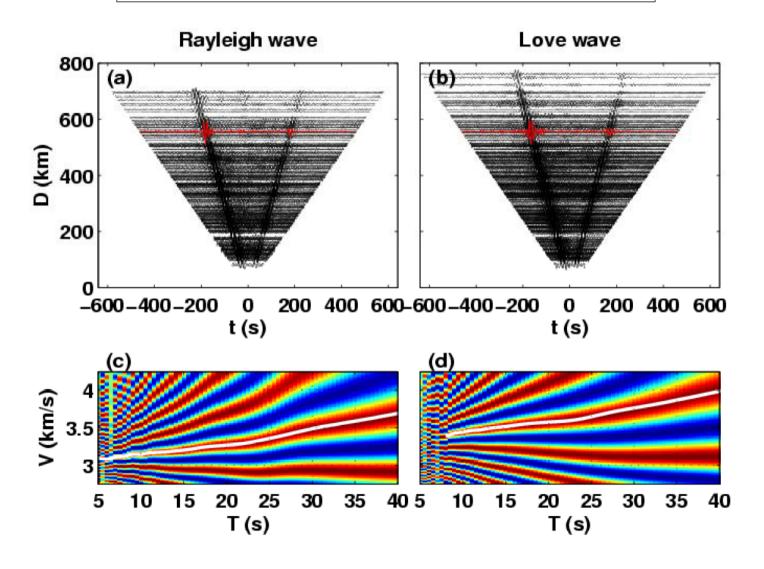
# strong variation of azimuthal anisotropy with depth



# strong variation of azimuthal anisotropy with depth



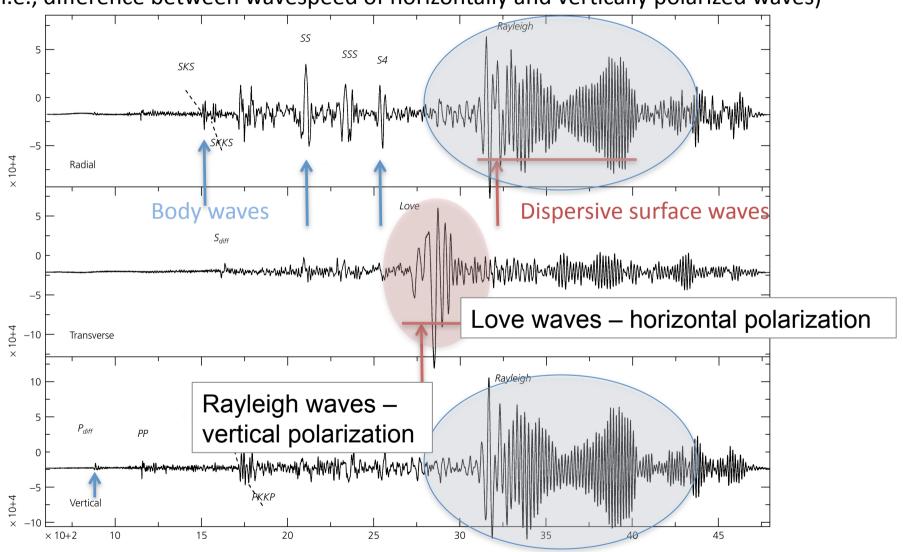
Radial Anisotropy from joint inversion of Love and Rayleigh wave dispersion (empirical Green's functions for noise correlation).



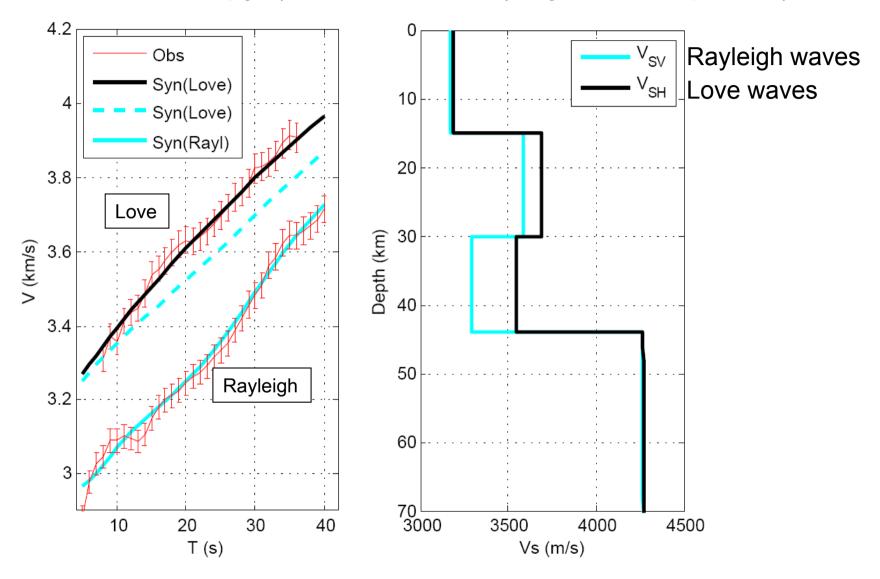
Huang, Yao, and Van der Hilst (GRL, 2010)

### **Anisotropy II: Radial Anisotropy (or: transverse isotropy)**

(i.e., difference between wavespeed of horizontally and vertically polarized waves)

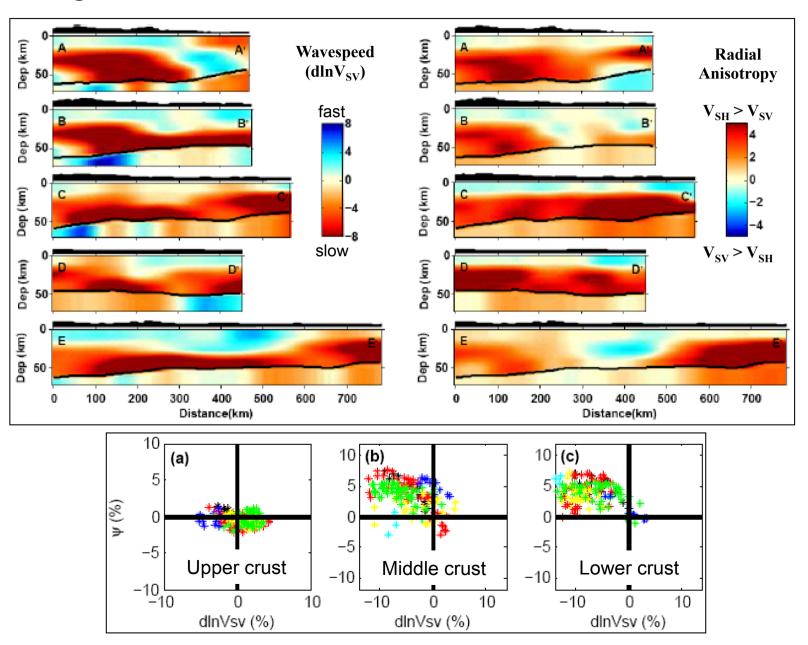


# Radial Anisotropy (from Love and Rayleigh wave dispersion)

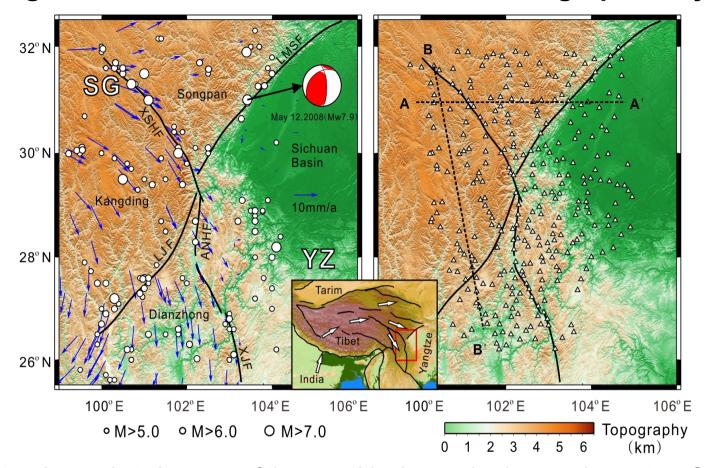


Huang, Yao, and Van der Hilst (GRL, 2010)

# Strong correlation with LVZs → horizontal flow in weak zones?

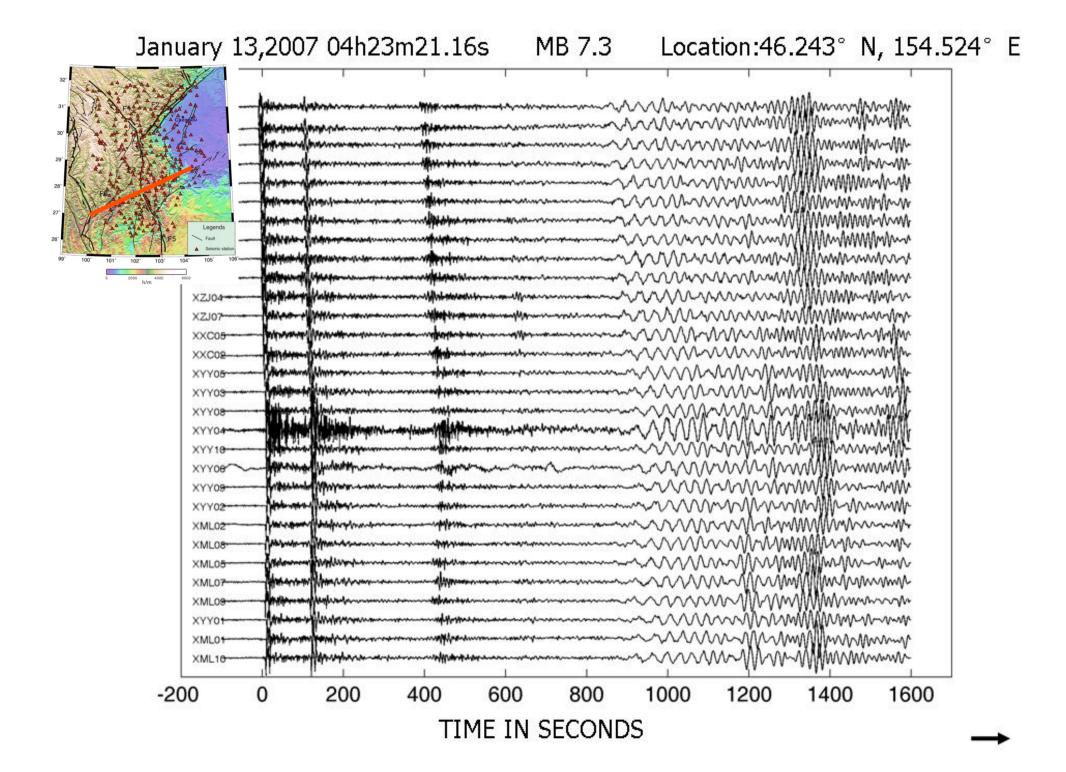


### High resolution studies with dense seismograph arrays

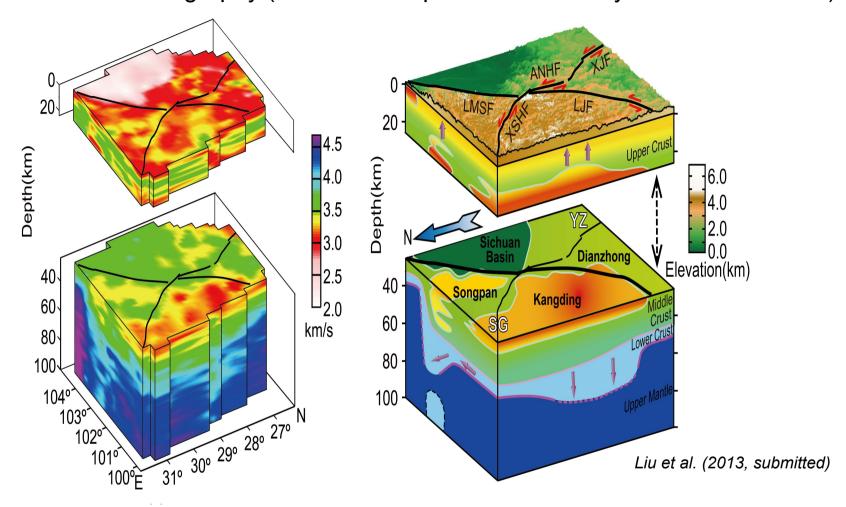


Geological setting and station map of the movable dens seismic array in western Sichuan (State Key Laboratory of Earthquake Dynamics, Institute of Geology, China Earthquake Administration). Black solid lines: major faults; blue triangles: stations; yellow circles: earthquakes (Ms ≥ 5.0,1901-2010, 2008 Wenchuan focal mechanism); blue arrows: crustal motion relative to the Yangze craton from GPS; red dash lines: seismic profile.

[SB=Sichuan Basin; YZ=Yangtze block; CD=Chundian unit; SG= Songpan-Ganze unit] [XSH=Xiangshuihe; LMS=Longmen Shan; ANH=Anninghe; LJ=Lijiang fault]

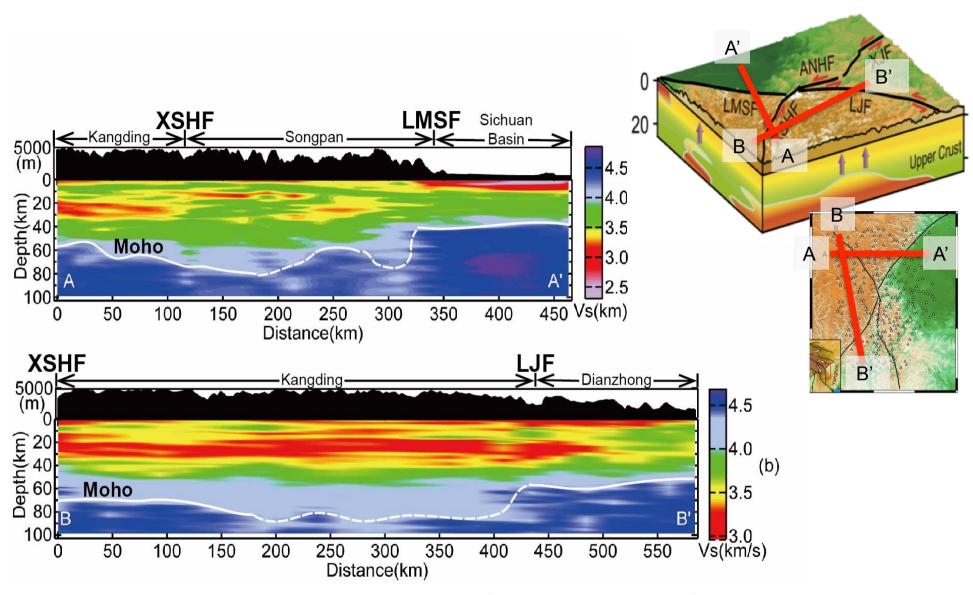


### Ambient Noise Tomography (with Moho depth constrained by receiver functions)

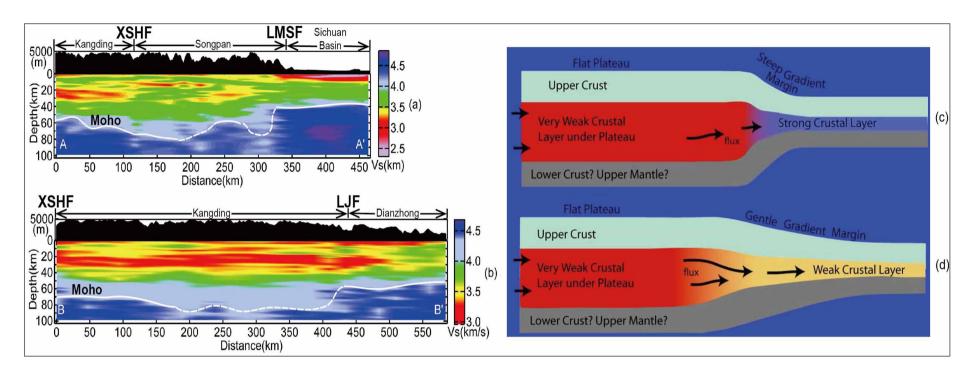


3D perspectives of lithospheric shear-wavespeed variations in relation to surface topography and major fault systems in the region. Left: wavespeeds from joint inversion; Right: cartoon summarizing the main structural and topographic features.

[SB=Sichuan Basin; YZ=Yangtze block; CD=Chundian unit; SG= Songpan-Ganze unit] [XSH=Xiangshuihe; LMS=Longmen Shan; ANH=Anninghe; LJ=Lijiang fault]



Topography and shear wavespeed variations from joint inversion of P-receiver functions and Ambient Noise (Rayleigh wave) Tomography across region of steep relief (A-A'; top) and gentle topographic gradient (B-B'; bottom).

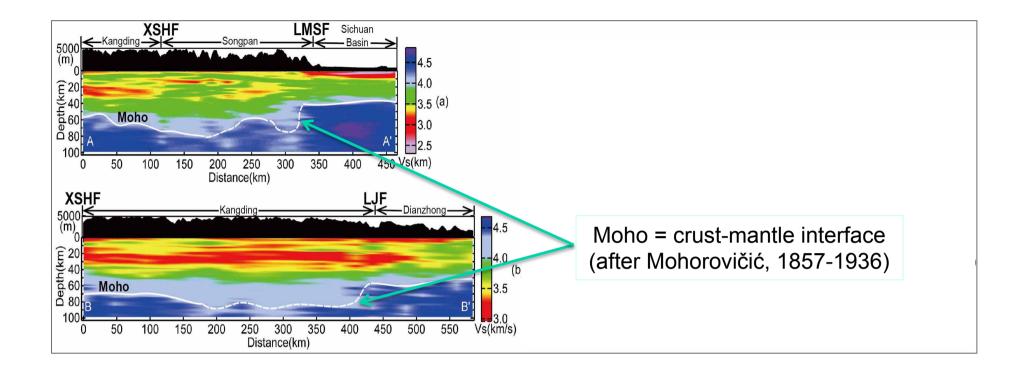


Crustal structure constrained by waveform data obtained by a dense seismography array in western Sichuan.

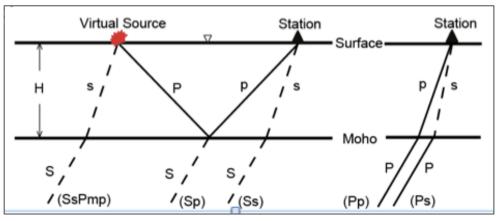
Concept: canonical channel flow model. (Figure courtesy of L. Royden, MIT).

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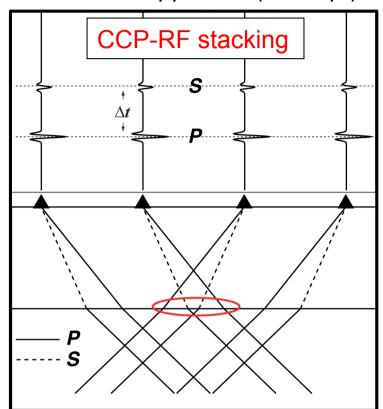


Imaging of the Moho with Converted Waves (P-to-5) or (S-to-P)



Yu et al.(EPSL, 2012)

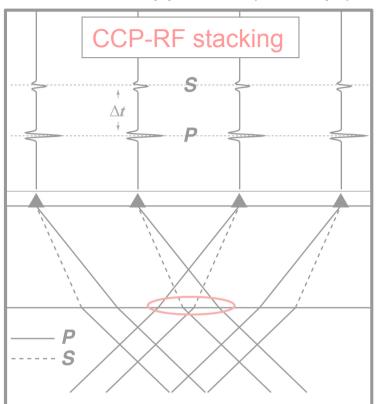
# Traditional approach (concept)



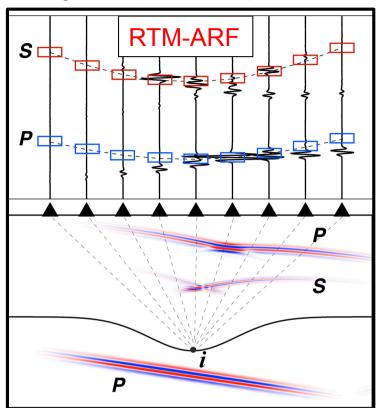
Common Conversion Point stacks of converted waves (Receiver Functions):

- -Time differences mapped directly to depth
- -Horizontal interfaces

### Traditional approach (concept)



Shang et al. (GRL, 2012)

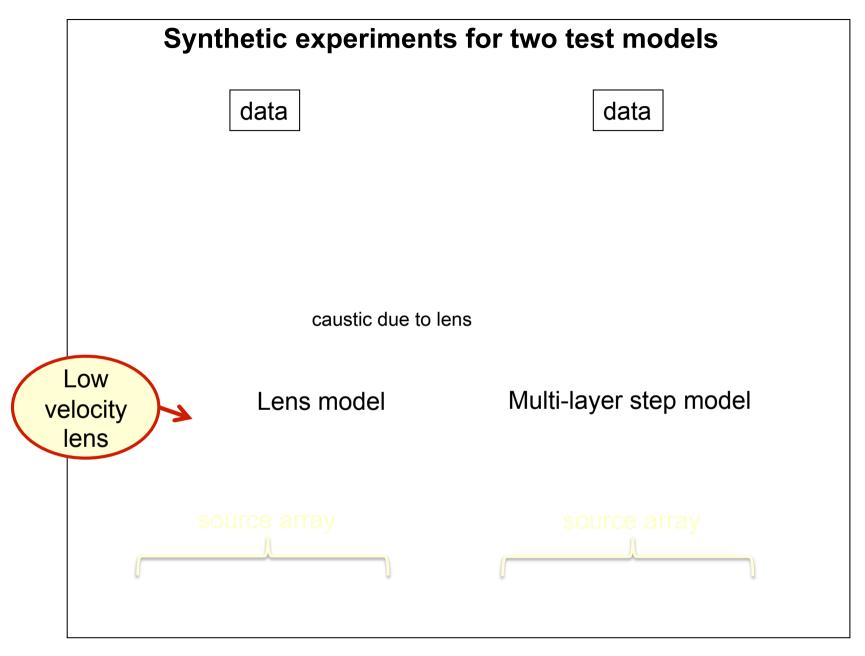


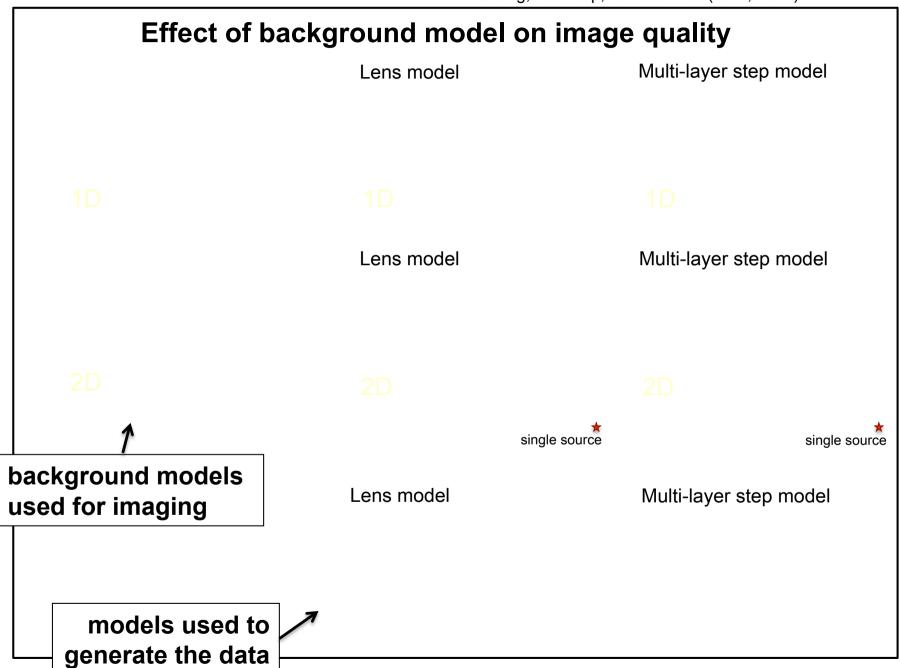
Common Conversion Point stacks of converted waves (Receiver Functions):

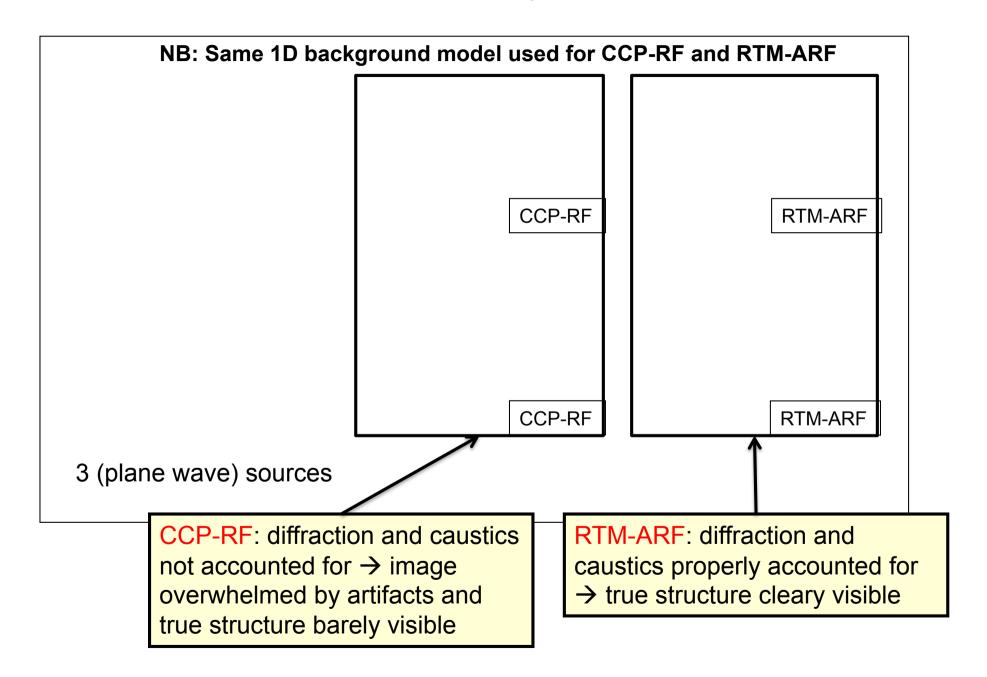
- -Time differences mapped directly to depth
- -Horizontal interfaces

Reverse Time Migration of Array Receiver Functions:

- Cross-correlations: incoming & time reversed and P & S waves ("imaging condition")
- No assumption on structure







# Image accuracy depends on background model

Can be obtained from tomography

E.g., travel time, surface waves, ambient noise ...

Or ....

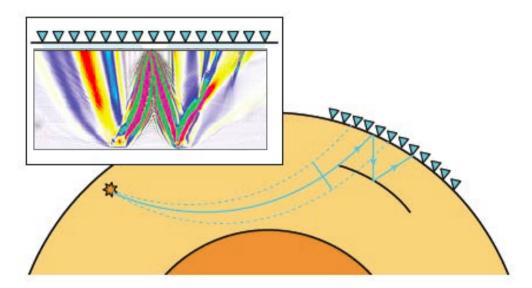
RTM based (teleseimic) reflection tomography

# Teleseismic wave-equation reflection tomography using free surface reflected phases

S. Burdick<sup>1</sup>, M. V. de Hoop<sup>2</sup>, S. Wang<sup>2</sup> R. D. van der Hilst<sup>1</sup>

Department of Earth, Atmospheric, and Planetary Sciences, Massachusetts Institute of Technology Cambridge, MA 02139, USA

<sup>2</sup> Department of Mathematics, Purdue University

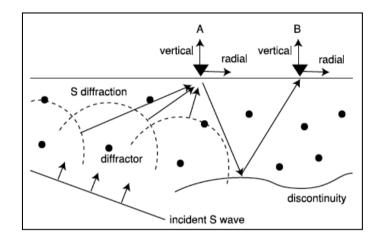


Construct images from converted and multiply-reflected teleseismic phases

# Overview of lecture:

- 1.Introduction/background
- 2. Ambient noise and surface wave tomography
- 3. Reverse time migration of converted waves
- 4.Interferometry of teleseismic (coda) waves

### For instance, imaging of the slab interface

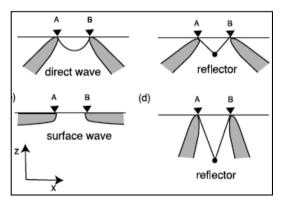


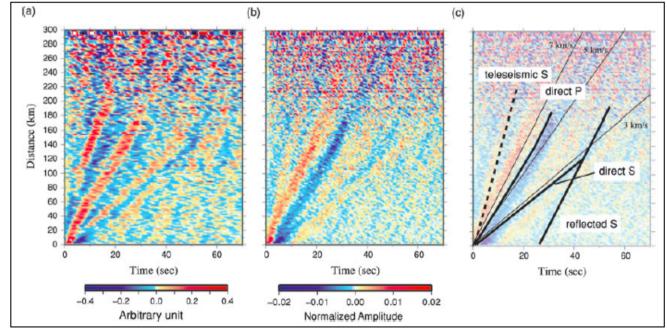
Seismic interferometry of teleseismic S-wave coda for retrieval of body waves: an application to the Philippine Sea slab underneath the Japanese Islands

Takashi Tonegawa, 1 Kiwamu Nishida, 1 Toshiki Watanabe 2 and Katsuhiko Shiomi 3

Accepted 2009 May 11. Received 2009 April 20; in original form 2009 January 22

Tonegawa et al. (GJI, 2009)





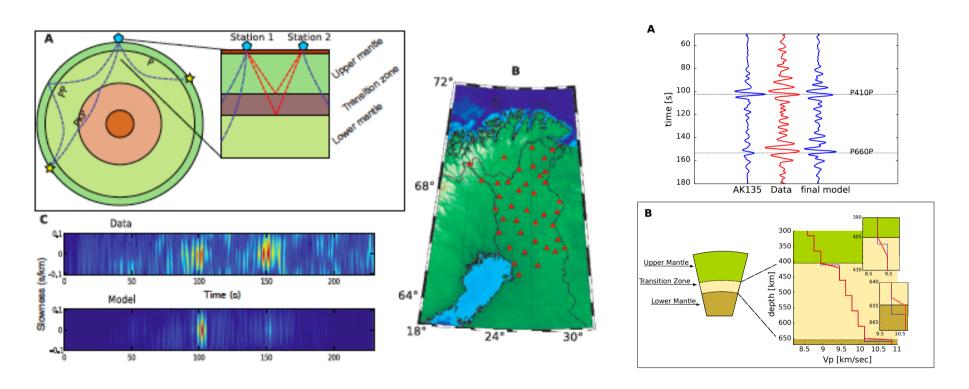
<sup>&</sup>lt;sup>1</sup> Earthquake Research Institute, Univ. of Tokyo, 1-1-1, Yayoi, Bunkyo-ku, Tokyo 113-0032, Japan. E-mail: tonegawa@eri.u-tokyo.ac.jp

<sup>&</sup>lt;sup>2</sup>Graduate School of Environmental Studies, Nagoya University, Furo-cho, Chikusa-ku, Nagoya 464-8602, Japan

<sup>&</sup>lt;sup>3</sup>National Research Institute for Earth Science and Disaster Prevention, 3-1, Tennodai, Tsukuba, Ibaraki 305-0006, Japan

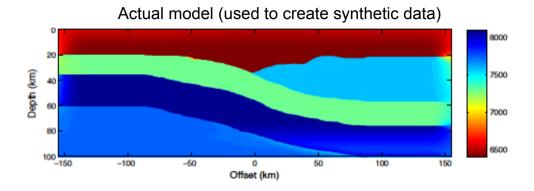
### Or passive imaging: Earth's mantle discontinuities from ambient seismic noise.

Poli et al. (Science, 2012)

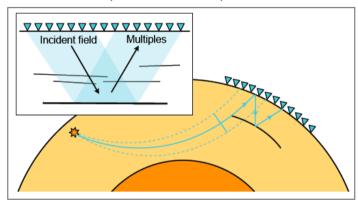


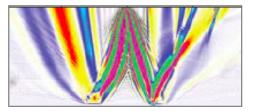
Campillo (Cargese, 2013)

Construct images from converted and multiply-reflected teleseismic phases

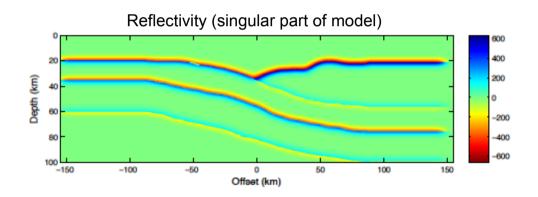


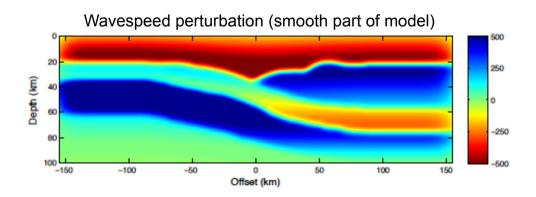
#### Burdick et al. (GJI, submitted)



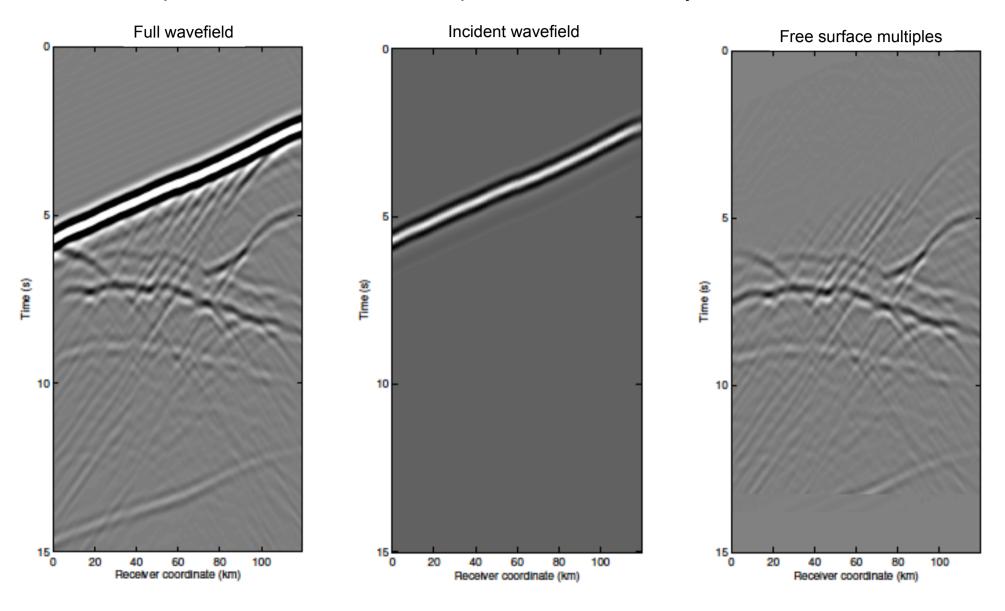


Wave-equation reflection tomography → full finite frequency (De Hoop et al., (GJI, 2006)

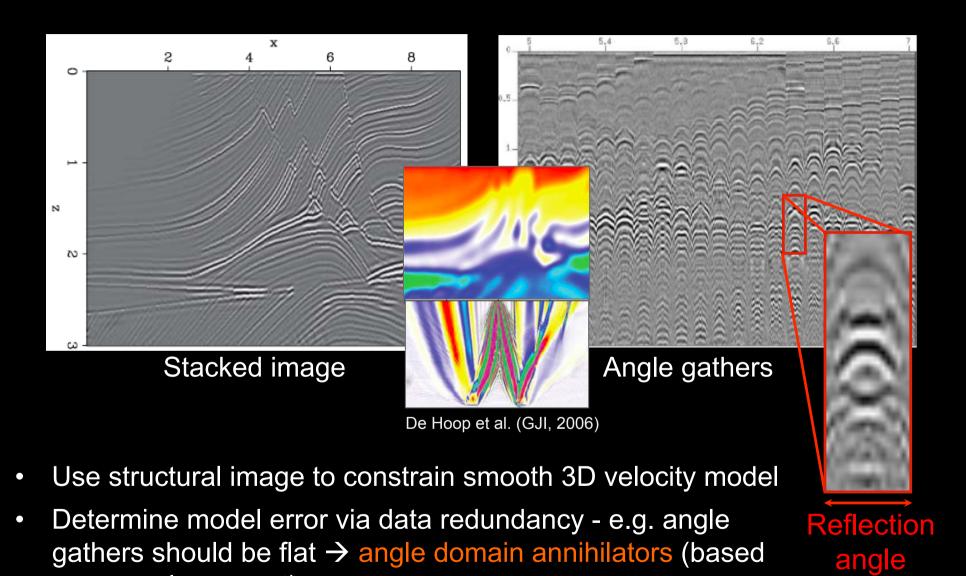




### Separation of the direct and multiple fields: interferometry/cross-correlation

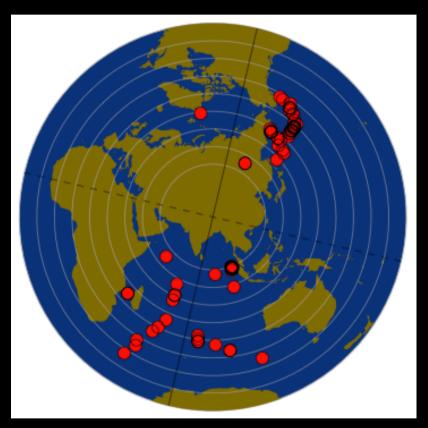


# Wave equation reflection tomography



on normal moveout)

# Challenges of teleseismic data



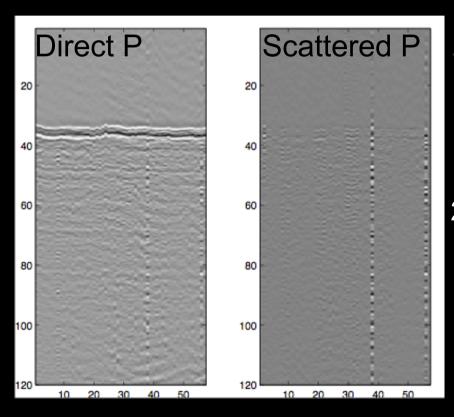
Events magnitude > 5.0 < 30° from great circle arc

Limited global seismicity & irregular array configurations → limited angular and azimuthal data
 → Angle domain applibilation not

→ Angle domain annihilation not effective

Burdick et al. (GJI, submitted)

# Challenges of teleseismic data

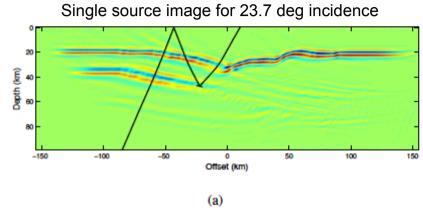


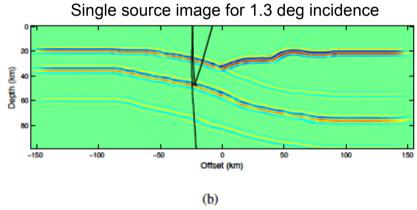
- Limited global seismicity & irregular array configurations → limited angular and azimuthal data
- 2) Unknown source functions, varying frequency content, long source-time signatures → imperfect deconvolution

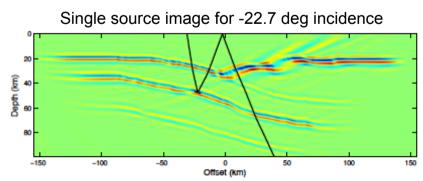
Direct and scattered fields separated by MCCC, singular value decomposition

Burdick et al. (GJI, submitted)

## Single source images formed using inverse scattering for teleseismic sources arriving from different directions





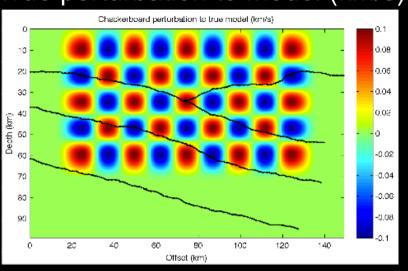


#### Power norm error function

- Misfit criterion based on correlation of images formed from different sources → maximum correlation gives best optimal velocity model
- More robust than error function based on depth move-out (angle domain annihilation)

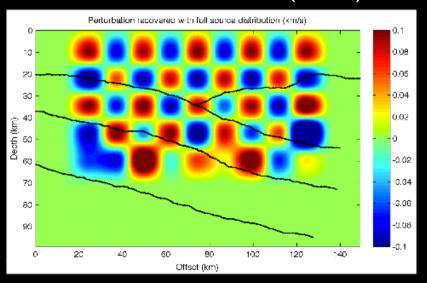
# Checkerboard inversion test

# True perturbation to model (km/s)

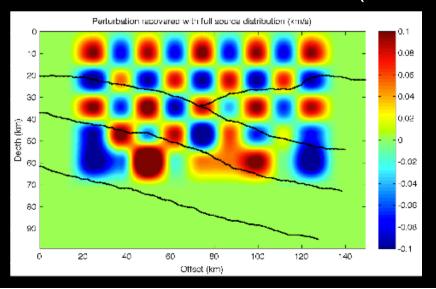


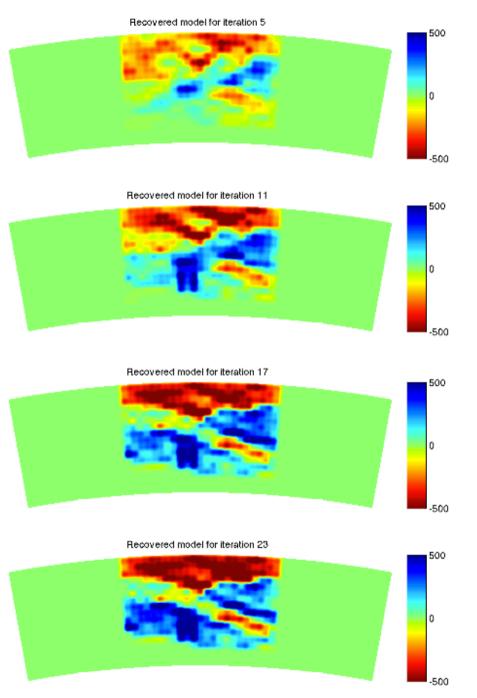
- Simple checkerboard basis projected onto 2D subduction model
- Perturbation recovered via least squares inversion

# Inversion w/ all events (km/s)



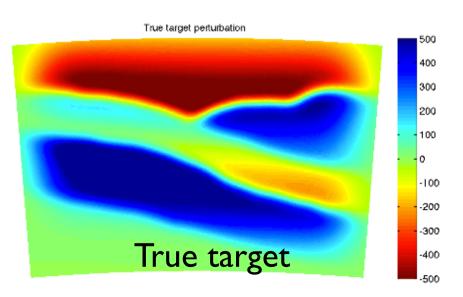
# Inversion w/ realistic subset (15-30°)





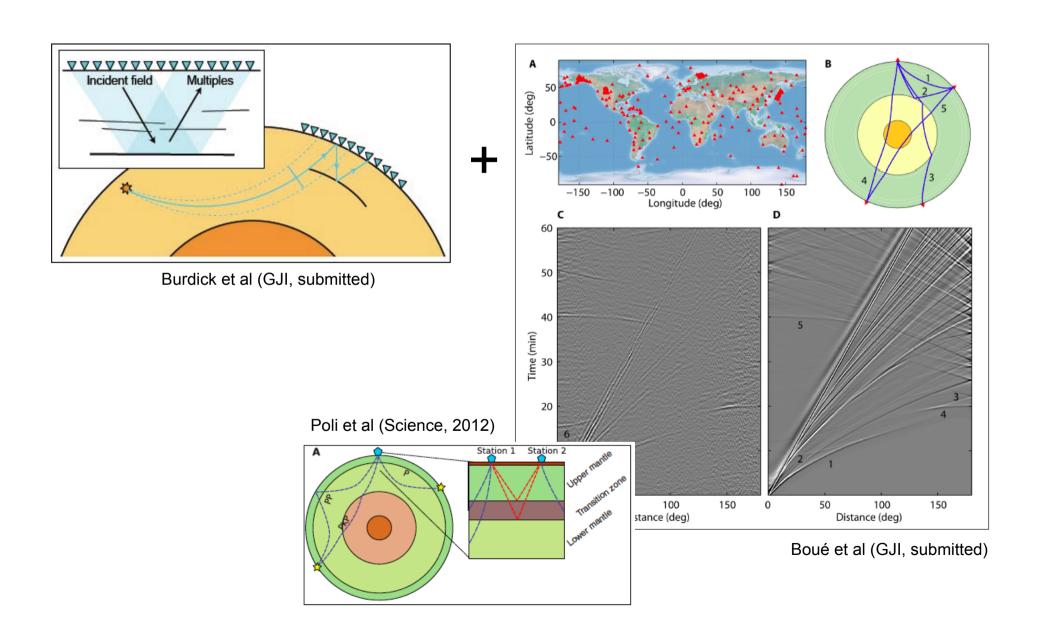
# Preliminary results

Inversion with fine basis, spherical coordinates



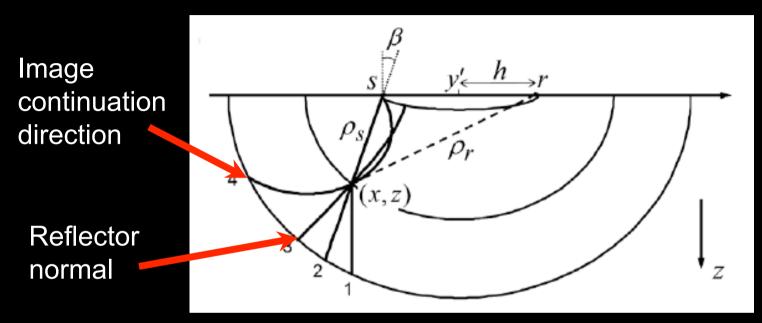
Burdick et al. (GJI, submitted)

# Cargese 2015 (or 2017)?



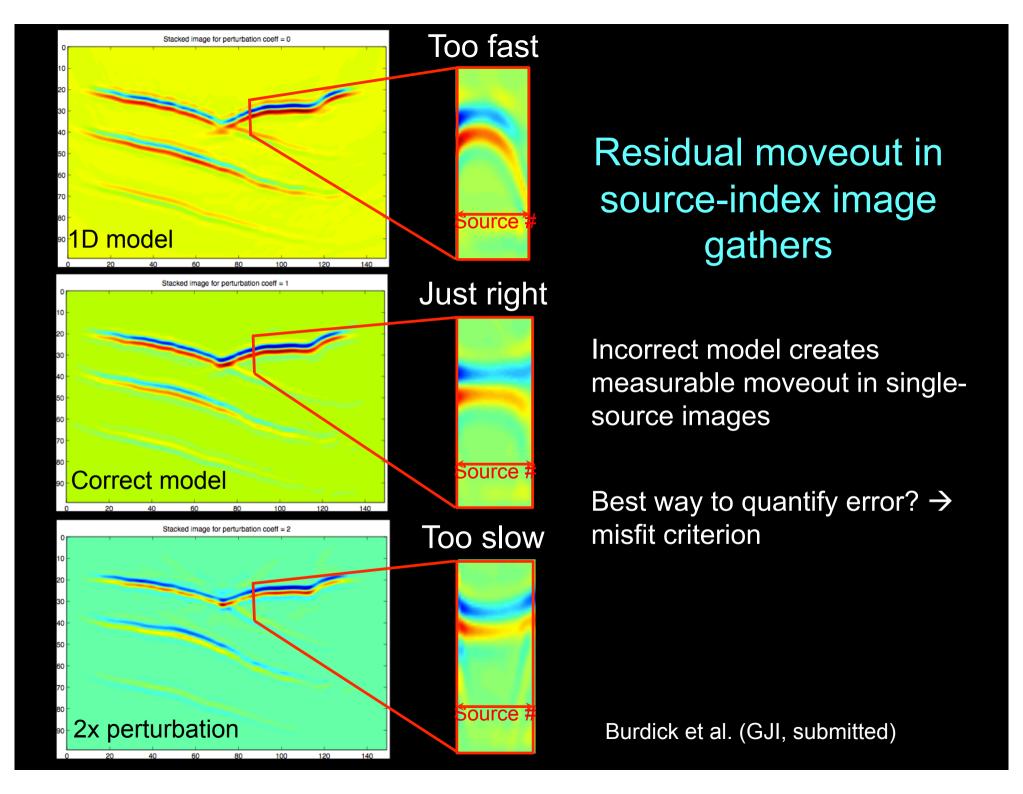


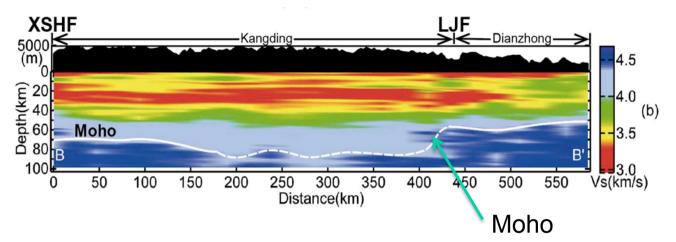
# Image point moveout? In what direction?



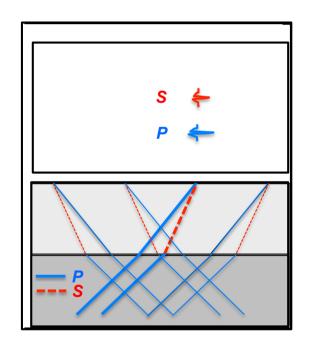
Duchkov et al. 2008

- Image continuation under velocity change is non-linear and not generally normal to reflector
- Solution to continuation ray system needed
- Instead: pure finite frequency measure





(crust-mantle interface; after Mohorovičić, 1857-1936)



Imaging With Converted Waves (P-to-5 or 5-to-P)

Strong Moho topography

Problem: Traditional Receiver

Function analysis assumes

horizontal interfaces

PhD Research: Xuefeng Shang (supported by Shell and CMG Program of NSF) Shang et al. (GRL, 2012)