



# Seismic imaging from ambient noise, earthquake surface waves and body waves

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With contributions from:

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2015 Cargese workshop

#### **Outline**

- Joint ambient noise and earthquake surface wave tomography (isotropic and anisotropic crust and upper mantle structures)
- Direct ambient noise/surface wave travel time tomography with ray tracing and wavelet-based inversion
- Joint ambient noise and body wave travel time tomography

Primary Goal: enhance the resolution and reliability of seismic images, and better understand tectonics and dynamics of Earth's interior

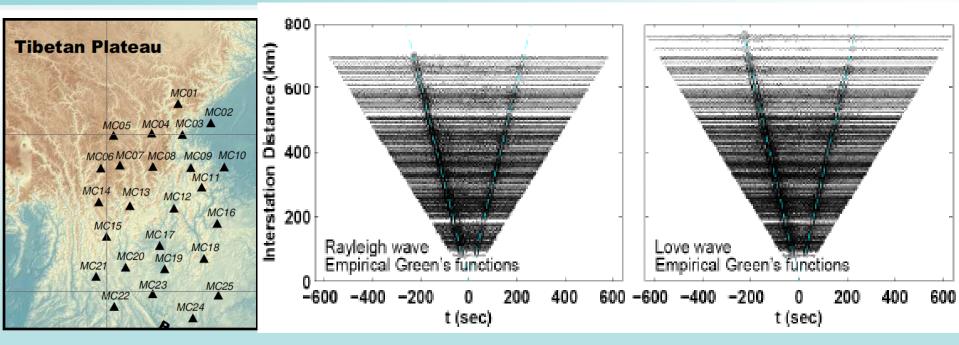
#### **Outline**

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#### **Ambient Noise Cross-Correlation**

Z-Z → Rayleigh

 $T-T \rightarrow Love$ 

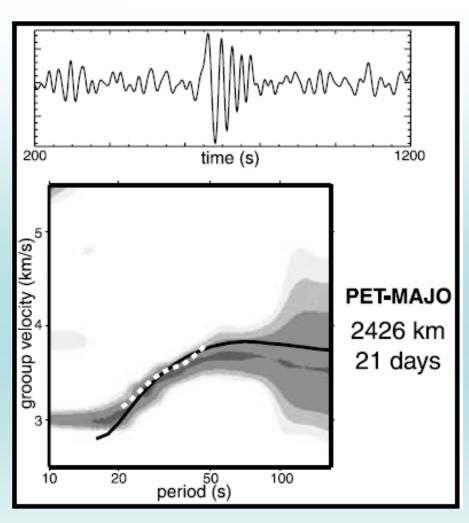


Inter-station ambient noise cross-correlation (5 – 40 s)

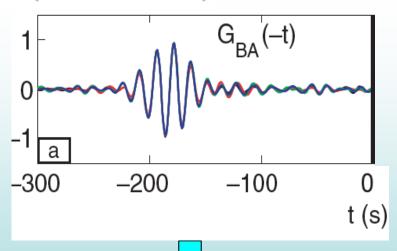
- → Surface wave propagation between stations
- → Vsv / Vsh crustal structure beneath the array

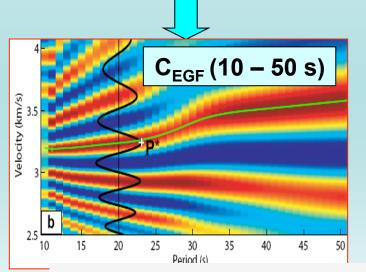
#### Group and Phase Velocity Dispersion Measurements

$$\text{Re}\{G_{AB}(\omega)\exp(-i\omega t)\}\approx (8\pi kS)^{-1/2}\cos\left(k_{AB}\Delta - \omega t + \frac{\pi}{4}\right)$$



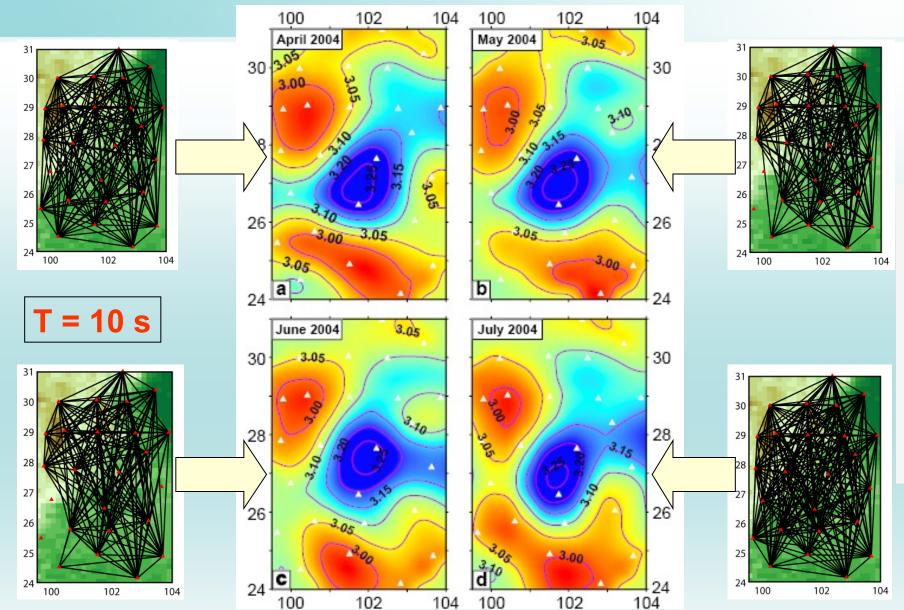
Shapiro & Campillo, GRL, 2004





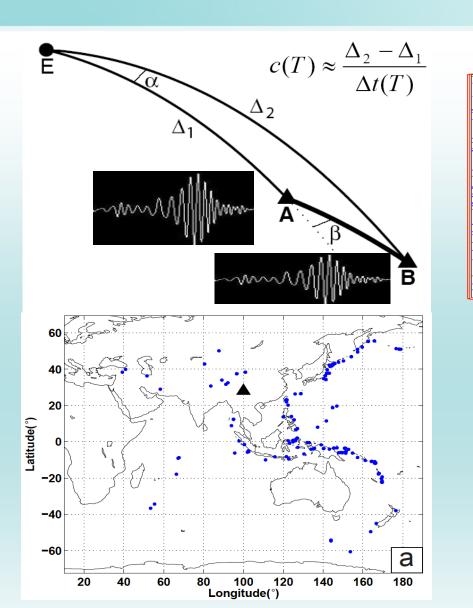
Yao, van der Hilst, de Hoop, 2006, GJI

### Monthly Rayleigh wave phase velocity maps from vertical component EGFs

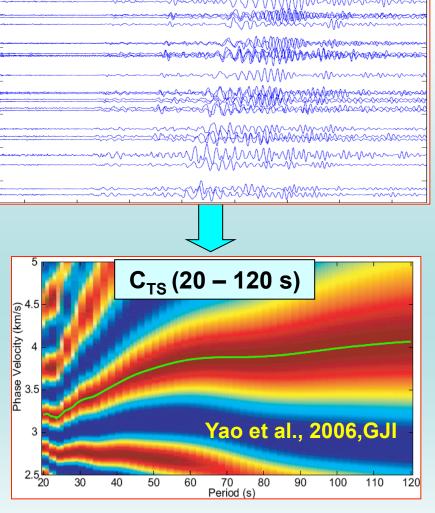


Yao, van der Hilst, de Hoop, 2006

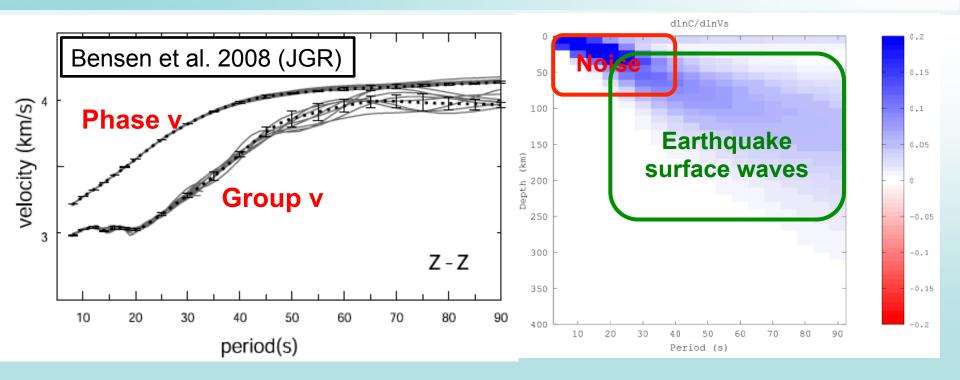
#### Earthquake Data: Two-station analysis



#### Teleseismic surface waves



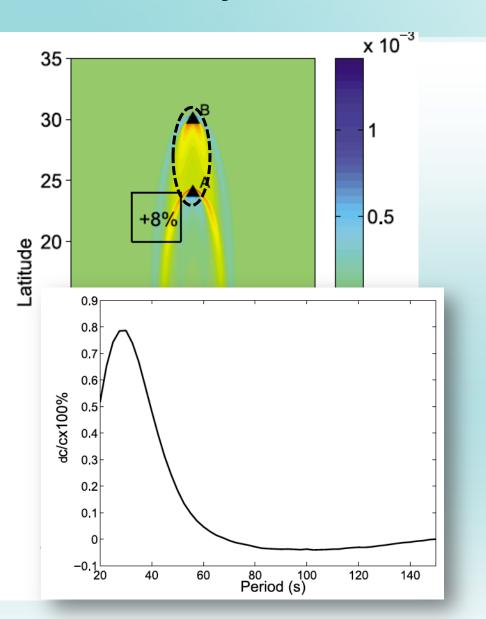
### Advantages of phase velocity measurements from ambient noise EGFs



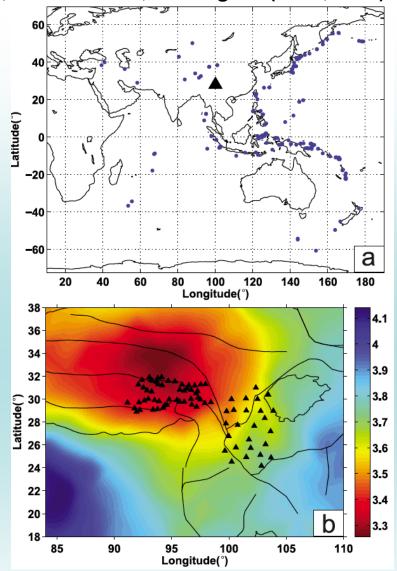
- 1. Better accuracy at longer periods (e.g., T=30s: error in group  $v \sim 2 \times error$  in phase v)
- 2. Easy to combine with inter-station phase velocity dispersion from earthquake data

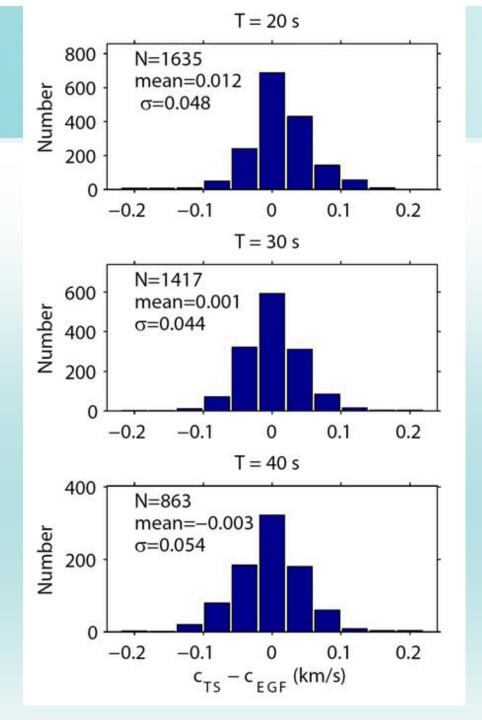
ambient noise: 5-40 s (5-70 km) earthquake surface wave: 20-150 s (20-250 km)

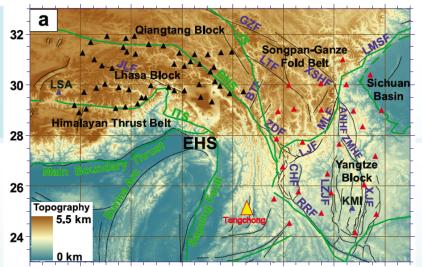
#### Sensitivity Kernels of TS and GF based travel times



Yao, van der Hilst, Montagner (2010, JGR)







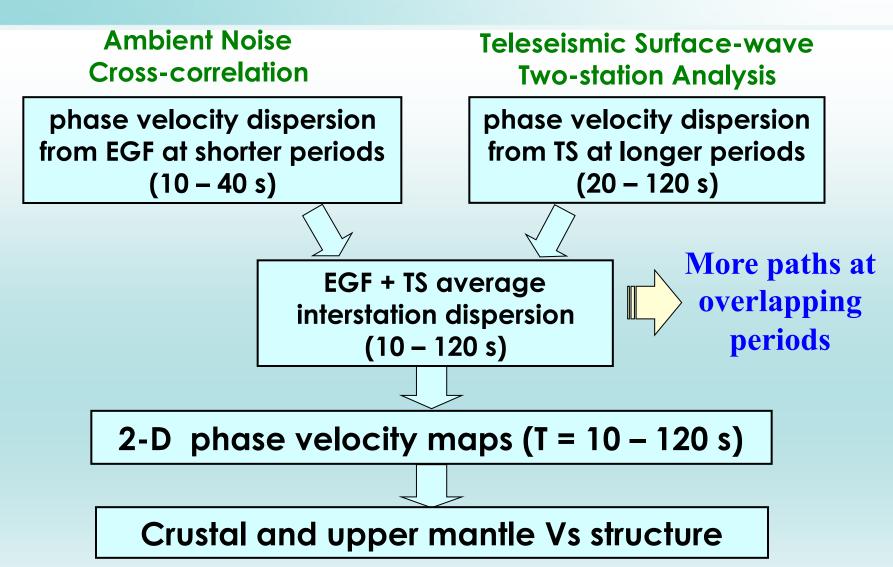
Phase velocity comparison between EGF and TS methods

Similar in the overlapping periods (20-40 s)

For T > 40 s, their differences become much larger

Yao, van der Hilst, Montagner (2010, JGR)

# Joint ambient noise and earthquake surface wave tomography: approach 1



# Joint ambient noise and earthquake surface wave tomography: approach 2

#### **Ambient Noise Interferometry**

phase velocity dispersion from EGF at shorter periods (5 – 40 s)

Travel time or eikonal tomography

phase velocity maps at shorter periods (~ 5 – 40 s)



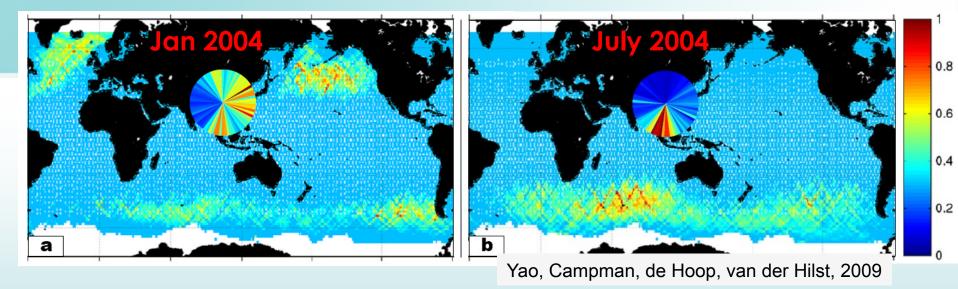
Teleseismic Surface-wave two plane-wave method /Helmholtz tomography

> phase velocity maps at longer periods (> 40 s)

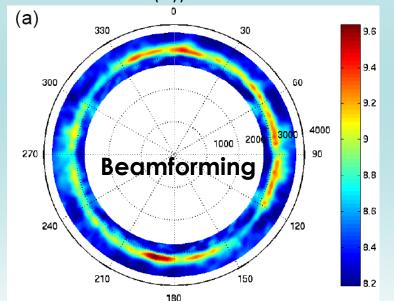


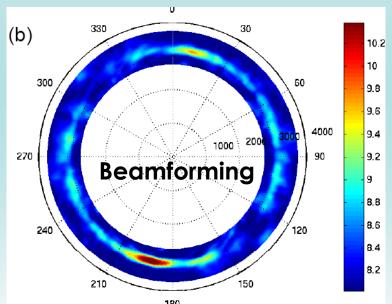
Crustal and upper mantle Vs structure

#### Uneven noise source distribution and biases in CFs/EGFs



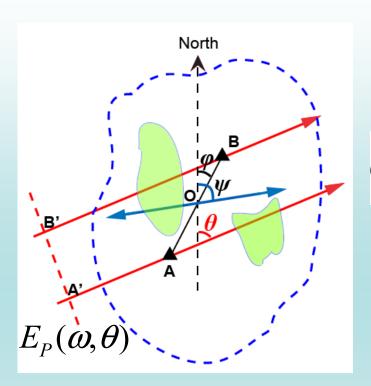
• Correlation of ambient noise energy (10-20s) with ocean wave activity (background image: normalized global ocean wave height in winter time (a) and in summer time (b))





## Uneven noise source distribution and its effects on ambient noise tomography

Theoretical works by: Weaver et al. 2009; Tsai, 2009



(Yao & van der Hilst, 2009, GJI)

 We use plane-wave modeling to estimate the noise energy distribution and phase velocity bias

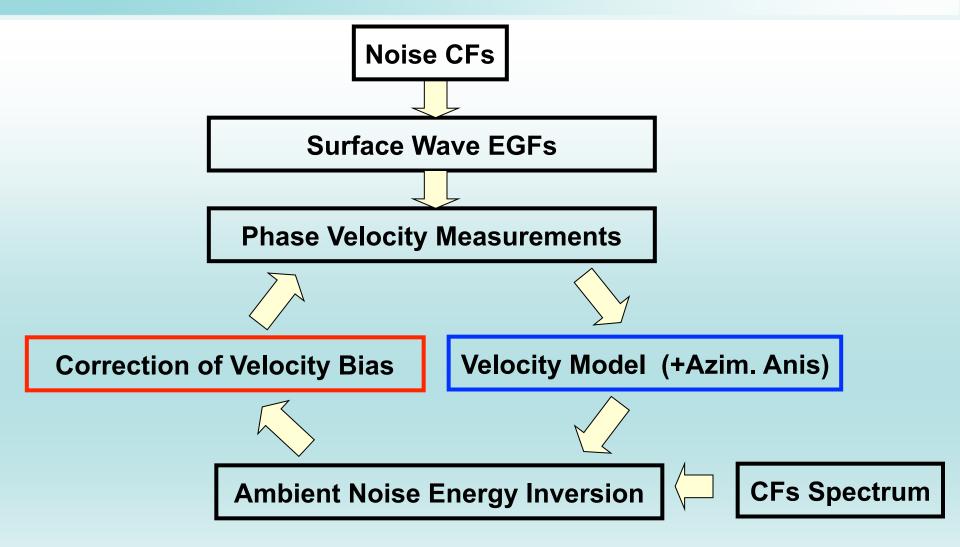
$$C_{AB}(\omega, t) = \int_0^{2\pi} E_P(\omega, \theta) \cos \left[\omega(t - \delta t)\right] H(t, \delta t) d\theta$$

δt: based on real model (with azimuthal anisotropy)

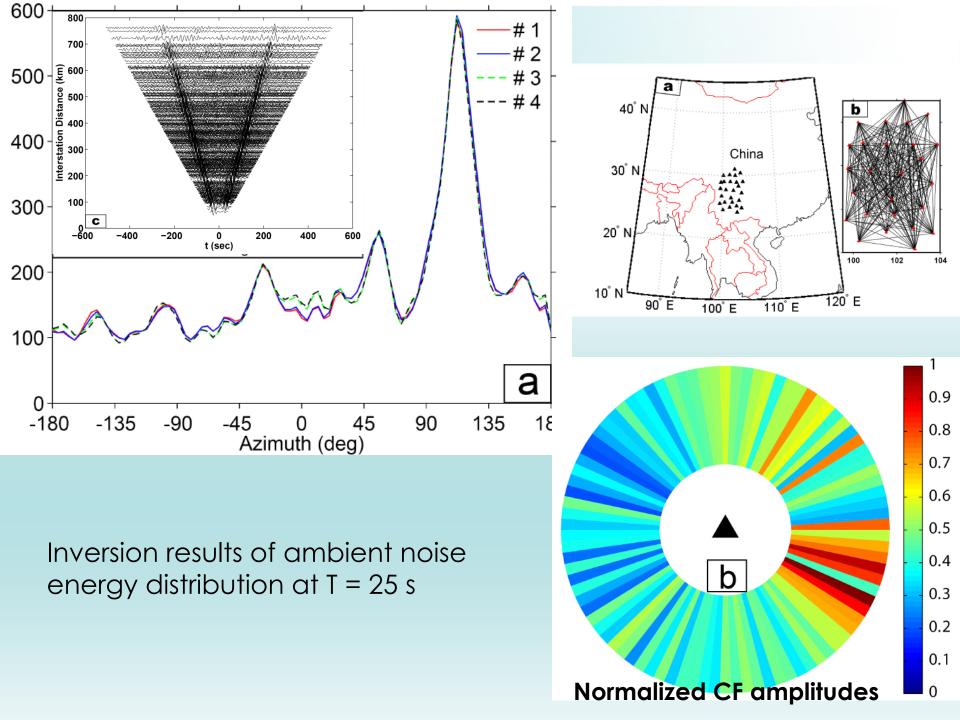
Some assumptions:

- # Small array (plane geometry)
- # Good inter-station azimuthal coverage
- # Ambient noise sources are far away
- # Weak local scattering

## Iterative modeling, inversion of noise amplitudes, correction of phase biases and tomographic images

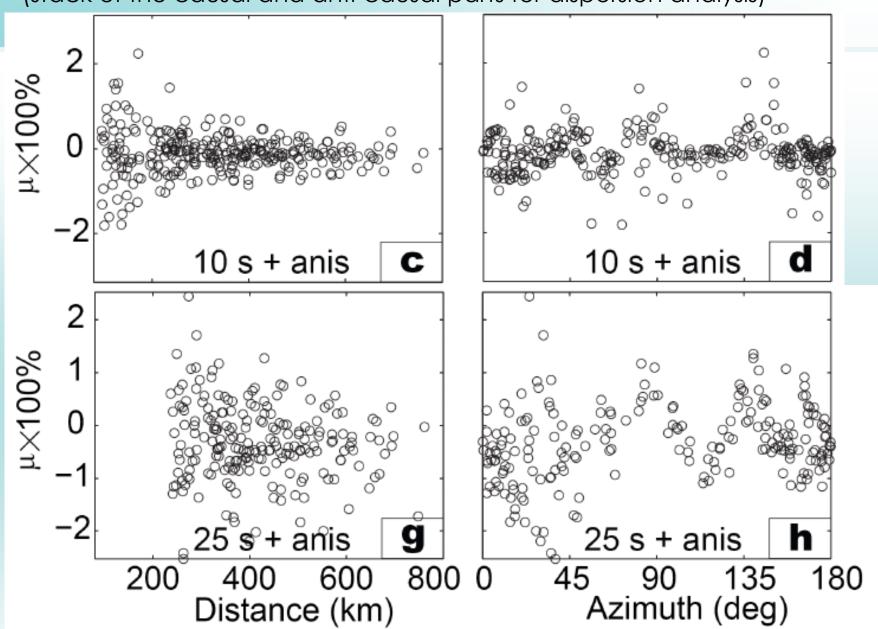


(Yao & van der Hilst, 2009, GJI)



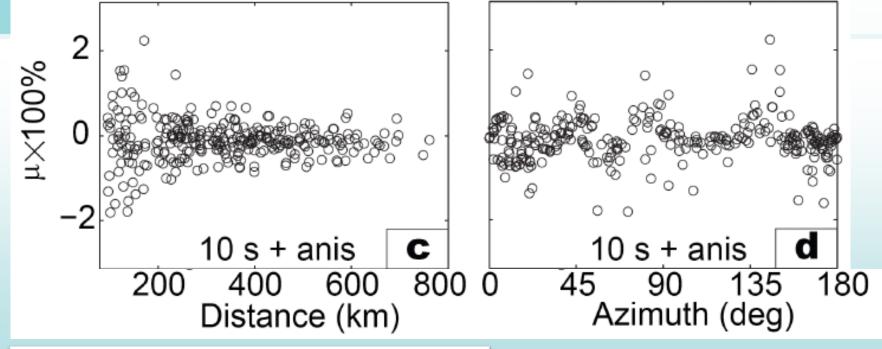
#### Inter-station phase velocity bias of EGFs

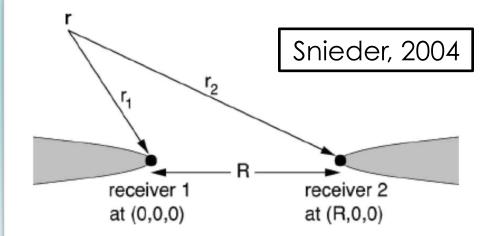
(stack of the causal and anti-causal parts for dispersion analysis)



#### Inter-station phase velocity bias of EGFs

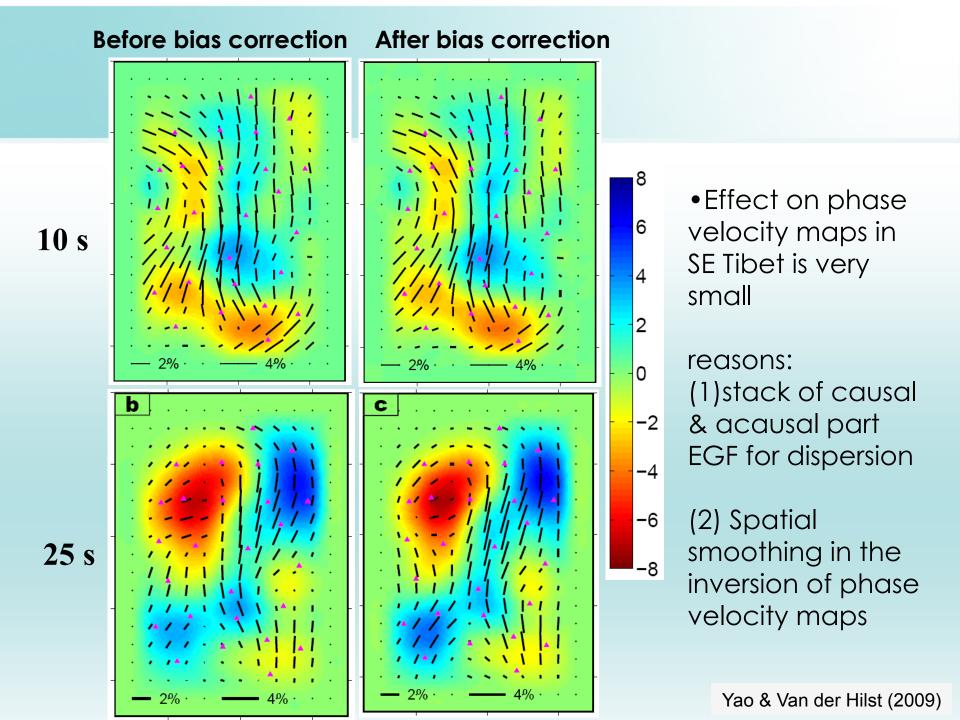
(stack of the causal and anti-causal parts for dispersion analysis)





small inter-station distance or larger wavelength

- → broad influence zone
- more sensitive to even source distribution



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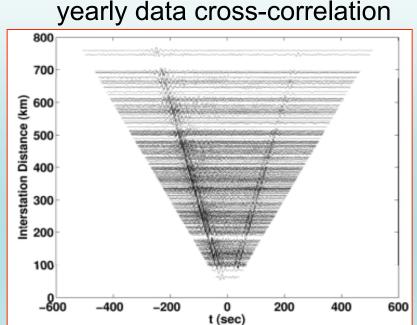
#### **Ambient Noise Tomography: large scale**

Great success in global/regional seismology for studying crustal structure (isotropic velocity + radial and azimuthal anisotropy)

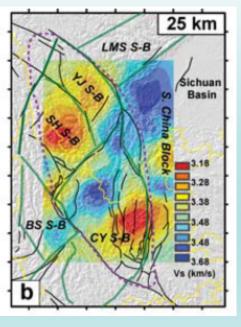
→ Standard array technique like receiver function, shear wave splitting, etc



~ 600 km scale



Period: 10 – 40 s λ: 30 – 150 km

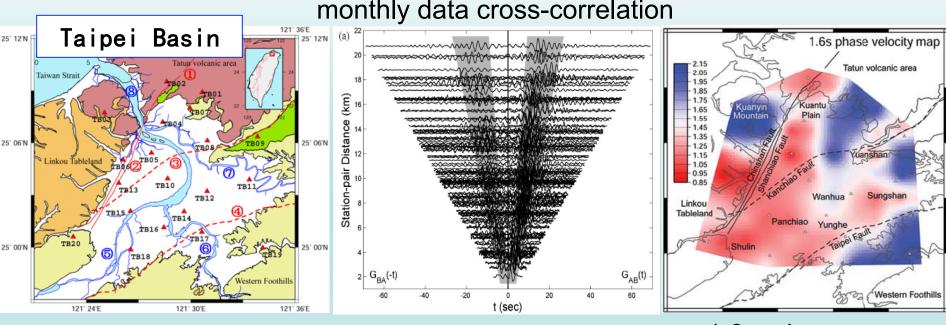


Mid-crust Vs

Yao et al. (2006, 2008)

#### **Ambient Noise Tomography: small scale**

Ambient noise tomography can be used to study (very) small scale shear velocity structure with closely spaced receivers.



~ 10 km scale

Period: 0.5-2 s $\lambda$ : 0.5 - 5 km

1.6 s phase v map (shallow upper crust)

Huang, Yao et al. (2010)

### Shallow crustal / near surface structure

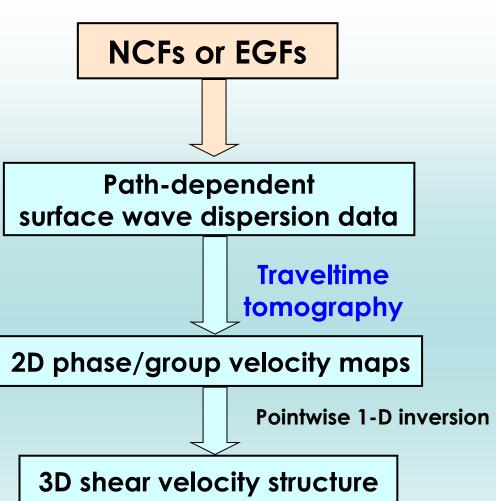
- Important for estimation of strong ground motion due to earthquakes
- Important for characterizing structures of oil/gas reservoir and mineral deposit fields

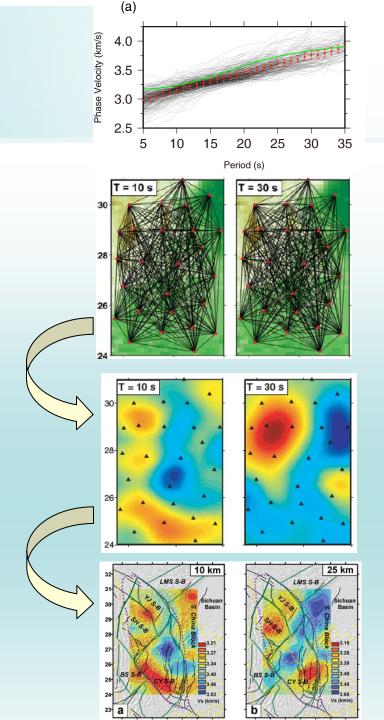
Most studies use either active sources or local earthquakes to image near surface structure

Ambient noise tomography provides an alternative and inexpensive way for imaging near surface structure

## Ambient noise tomography for shear velocity structure

**Traditional methods** 





## Ambient noise tomography for shear velocity structure

Eikonal tomography (Lin et al. 2009)

**NCFs** or EGFs

Dense array receiver-receivers surface wave traveltime data

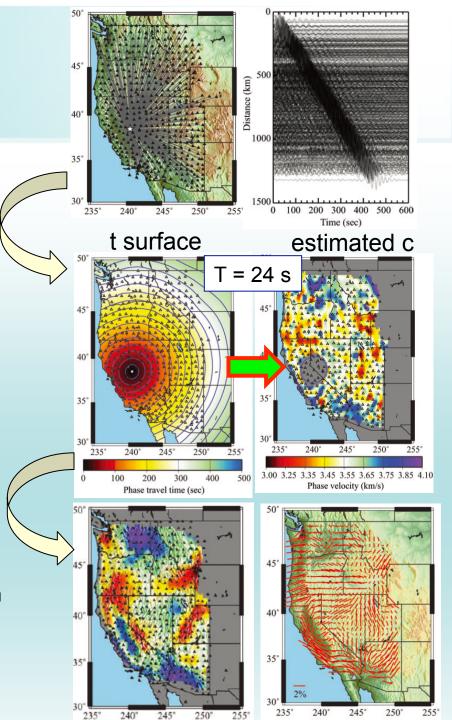
$$\frac{\hat{k}_i}{c_i(r)} \cong 
abla au(r_i, r)$$

**Eikonal** tomography

2D phase velocity maps

Pointwise 1-D inversion

3D shear velocity structure

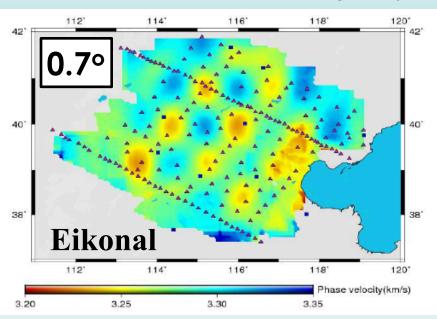


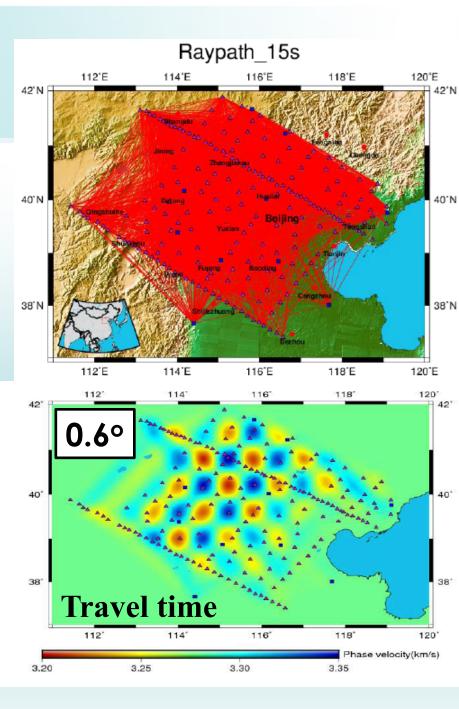
#### **Resolution issues**

Eikonal: straightforward method, no inversion, good estimation of azimuthal anisotropy

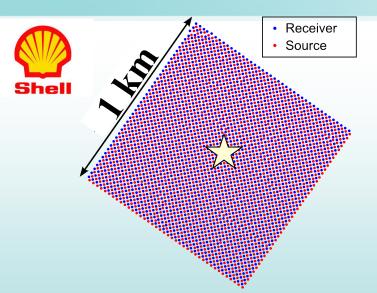
Spatial smoothing of traveltime surface

→ stable phase velocity maps, but lower spatial resolution (<station spacing) compared to traveltime tomography

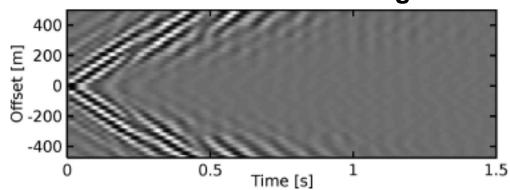




## Active source Eikonal tomography: dense array in reservoir scale







Neighborhood-based cross-correlation method to measure traveltimes

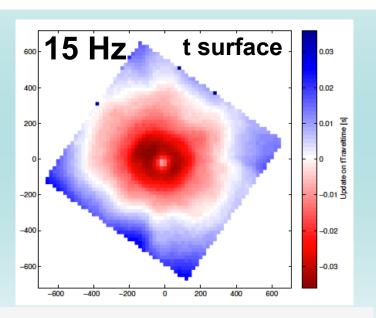
→ to void high-freq cycle skipping problem

$$\mathbf{D} \mathbf{t}^{\mathrm{s}} = \Delta \mathbf{t}^{\mathrm{s}}$$

ts: receiver traveltime vector

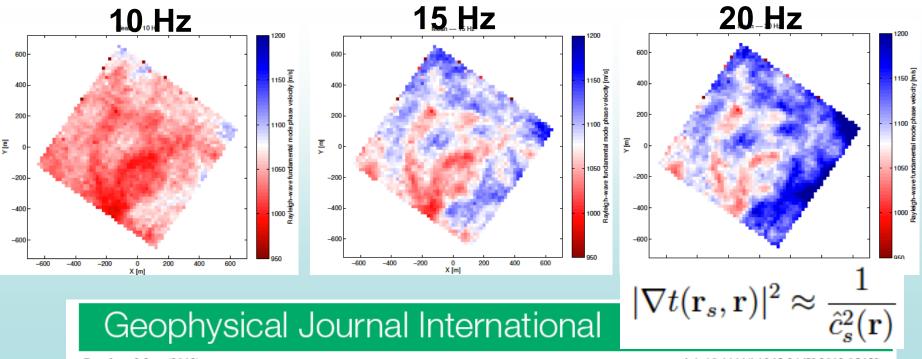
 $\Delta t^s$ : differential traveltimes between neighboring receivers

D: difference operator (matrix)



Gouedard, Yao, et al., 2012, GJI

#### **Active source Eikonal tomography**



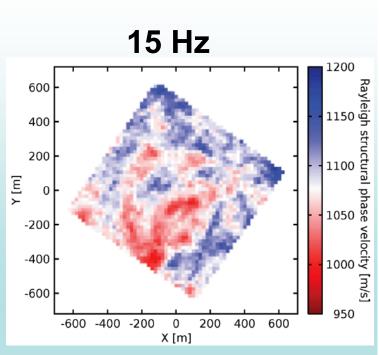
Geophys. J. Int. (2012) doi: 10.1111/j.1365-246X.2012.05652.x

Surface wave eikonal tomography in heterogeneous media using exploration data

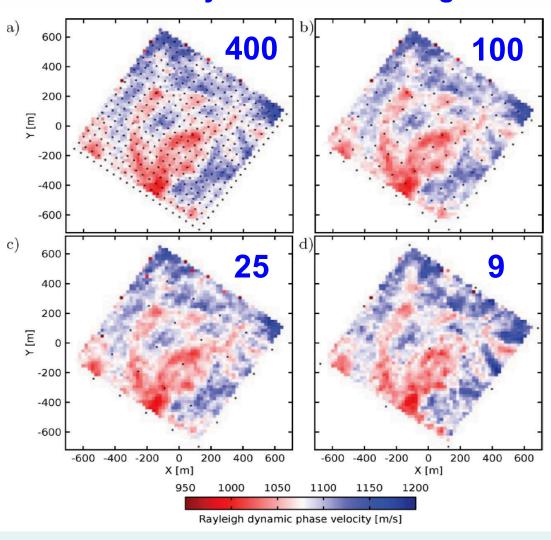
Pierre Gouédard, Huajian Yao, 1,2 Fabian Ernst and Robert D. van der Hilst 1

#### **Active source Eikonal tomography**

#### How many sources to average?



Average over 1600 sources



## Ambient noise tomography for shear velocity structure

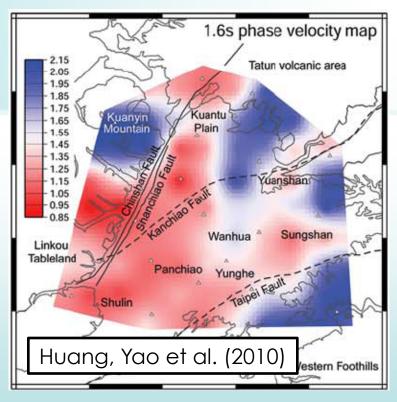
**Direct inversion method** 

NCFs or EGFs

Path-dependent surface wave dispersion data

Boschi & Ekström (2002): global surface wave tomography (no update on ray paths)

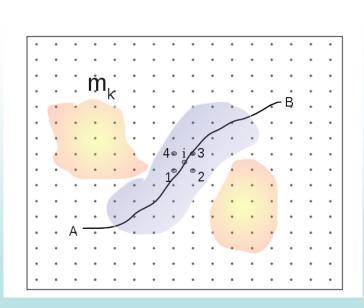
3D shear velocity structure



Phase Velocity perturbation > 30%

Need to consider frequencydependent off-great-circle propagation effect: surface wave raytracing using fast marching method (Rawlinson, 2004)

### Direct ambient noise / surface wave tomography for 3-D Vs structure with ray tracing



Traveltime at freq.  $\omega$ :

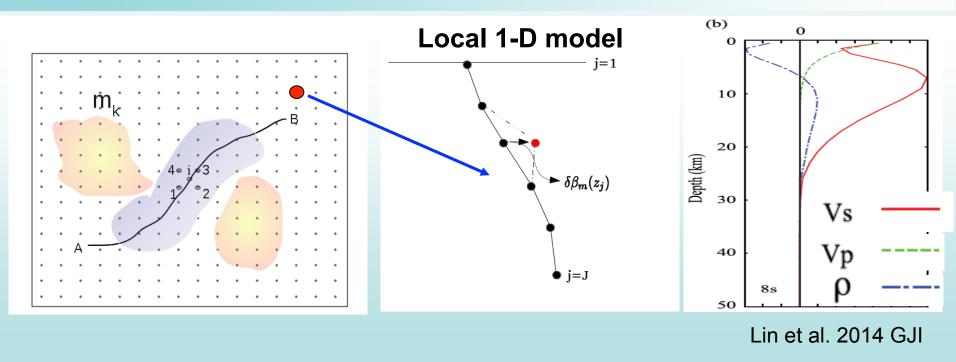
Slowness along path 
$$t_{AB}=\int\limits_{A}^{B}S(l_{AB},w)dl=\sum\limits_{p=1}^{P}S_{p}(l_{AB},w)\Delta l_{AB},$$
  $S_{p}(l_{AB},w)=\sum\limits_{k=1}^{K}\nu_{pk}\hat{S}_{k}(w),$  Slowness at grids  $t_{i}(w)=\sum\limits_{k=1}^{K}\upsilon_{ik}\hat{S}_{k}(w),$ 

#### **Traveltime perturbation:**

$$\delta t_i(w) = t_i(w) - t_i^r(w) = \sum_{k=1}^K \upsilon_{ik} \delta \hat{S}_k(w) = -\sum_{k=1}^K \upsilon_{ik} \frac{\delta C_k(w)}{C_k^2(w)},$$
Ref. travel time

Ref. travel time

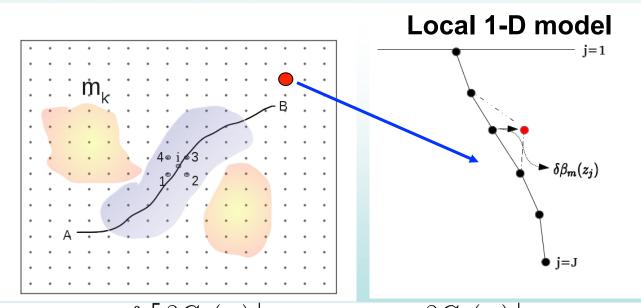
# Direct ambient noise / surface wave tomography for 3-D Vs structure with ray tracing



$$\delta C_k(w) = \int \left[ \frac{\partial C_k(w)}{\partial \alpha_k(z)} \bigg|_{M^r} \delta \alpha_m(z) + \frac{\partial C_k(w)}{\partial \beta_k(z)} \bigg|_{M^r} \delta \beta_k(z) + \frac{\partial C_k(w)}{\partial \rho_k(z)} \bigg|_{M^r} \delta \rho_k(z) \right] dz$$

Short period Rayleigh waves : also large sensitivity to shallow crustal Vp & density structure

### Direct ambient noise / surface wave tomography for 3-D Vs structure with ray tracing



update model → compute 2-D phase v maps > update all ray paths at each f and G matrix iteratively

$$\delta C_k(w) = \int \left[ \frac{\partial C_k(w)}{\partial \alpha_k(z)} \Big|_{M^r} \delta \alpha_m(z) + \frac{\partial C_k(w)}{\partial \beta_k(z)} \Big|_{M^r} \delta \beta_k(z) + \frac{\partial C_k(w)}{\partial \rho_k(z)} \Big|_{M^r} \delta \rho_k(z) \right] dz$$

$$\delta C_k(w) = \int \left[ \frac{\partial C_k(w)}{\partial \alpha_k(z)} \Big|_{M^r} \delta \alpha_m(z) + \frac{\partial C_k(w)}{\partial \beta_k(z)} \Big|_{M^r} \delta \beta_k(z) + \frac{\partial C_k(w)}{\partial \rho_k(z)} \Big|_{M^r} \delta \rho_k(z) \right] dz,$$

$$\delta t_i(w) = \sum_{k=1}^K \left( -\frac{v_{ik}}{C_k^2} \right) \sum_{j=1}^J \left[ P'_{\alpha}(z) \frac{\partial C_k}{\partial \alpha_k(z)} + P'_{\rho}(z) \frac{\partial C_k}{\partial \rho_k(z)} + \frac{\partial C_k}{\partial \beta_k(z)} \right] \Big|_{M^r} \delta \beta_k(z_j) = \sum_{j=1}^{KJ} G_{ij} m_j,$$

$$\Longrightarrow$$
  $\mathbf{d} = \mathbf{Gm}$ 

$$\Phi(\mathbf{m}) = ||\mathbf{d} - \mathbf{G}\mathbf{m}||_{2}^{2} + \lambda ||\mathbf{L}\mathbf{m}||_{2}^{2}$$

$$\hat{\mathbf{m}} = (\mathbf{G}^{T}\mathbf{G} + \lambda \mathbf{L}^{T}\mathbf{L})^{-1}\mathbf{G}^{T}\mathbf{d}$$

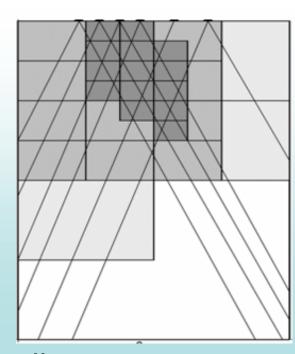
# Wavelet-based sparsity-constrained tomography: multiscale resolution based on ray path density

Orthogonal wavelet basis:  $\mathbf{W^{-1}} = \mathbf{W^T}$ 

Then: 
$$\tilde{\mathbf{m}} = \mathbf{W}\mathbf{m}$$
  $\tilde{\mathbf{G}} = \mathbf{G}\mathbf{W}^{\mathbf{T}}$ 

Velocity model is sparse under wavelet basis:

$$min \|\tilde{\mathbf{G}}\tilde{\mathbf{m}} - \mathbf{d}\|_1 + \lambda \|\tilde{\mathbf{m}}\|_1$$



L1 norm of data misfit: more robust to data outliers

L1 norm of model parameters : sparse wavelet coefficients

Solved by Iteratively Reweighted Least Squares Method (IRLS)

### Geophysical Journal International



doi: 10.1093/gji/ggv080

Geophys. J. Int. (2015) 201, 1251–1263

GJI Seismology

#### Direct inversion of surface wave dispersion for three-dimensional shallow crustal structure based on ray tracing: methodology and application

Hongjian Fang,<sup>1,2</sup> Huajian Yao,<sup>1,2</sup> Haijiang Zhang,<sup>1,2</sup> Yu-Chih Huang<sup>3,4</sup> and Robert D. van der Hilst<sup>5</sup>

<sup>&</sup>lt;sup>1</sup>Laboratory of Seismology and Physics of Earth's Interior, School of Earth and Space Sciences, University of Science and Technology of China, Hefei 230026, China. E-mail: hjyao@ustc.edu.cn

<sup>&</sup>lt;sup>2</sup>National Geophysical Observatory at Mengcheng, Anhui, China

<sup>&</sup>lt;sup>3</sup>Institute of Earth Sciences, Academia Sinica, Taipei, Taiwan

<sup>&</sup>lt;sup>4</sup>Taiwan Volcano Observatory at Tatun, Ministry of Science and Technology, Taipei, Taiwan

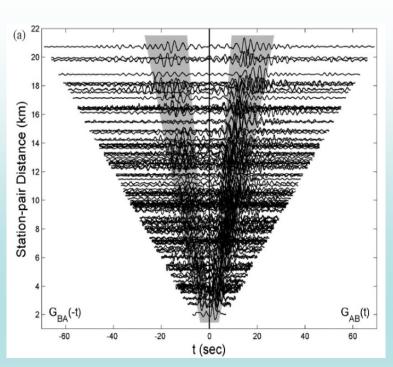
Department of Earth, Atmospheric, and Planetary Sciences, Massachusetts Institute of Technology, Cambridge, MA 02139, USA

### **Examples of direct ambient noise tomography**

#### (1) Taipei Basin in Taiwan

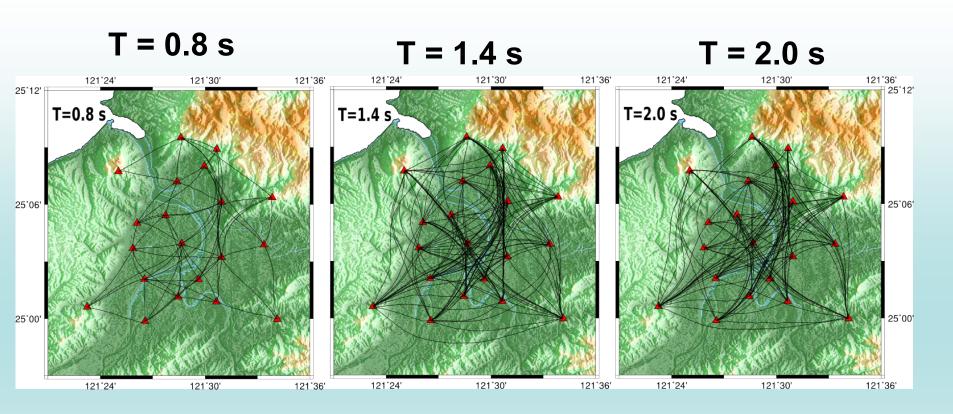


~ 10 x 10 km scale



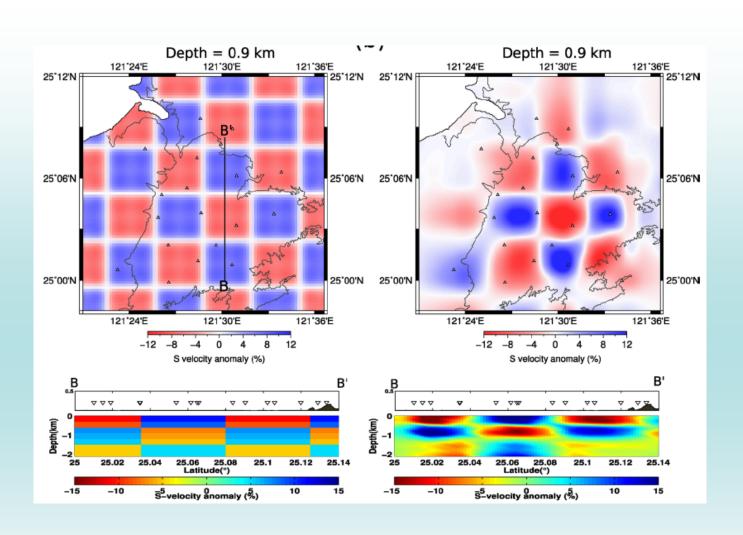
Period: 0.5-3 s

#### Ray path distribution using the final Vs model

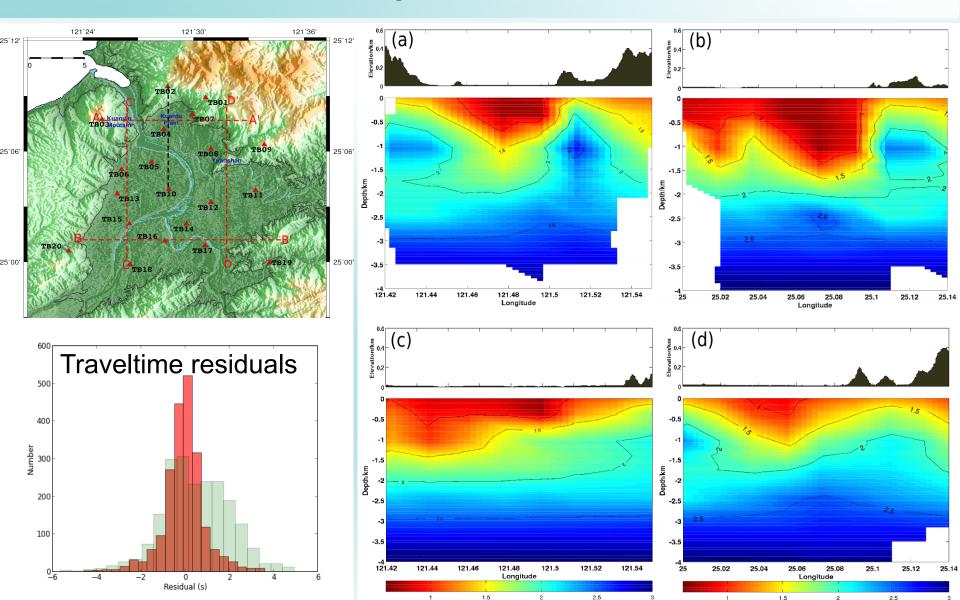


Strong effect of off-great-circle propagation!

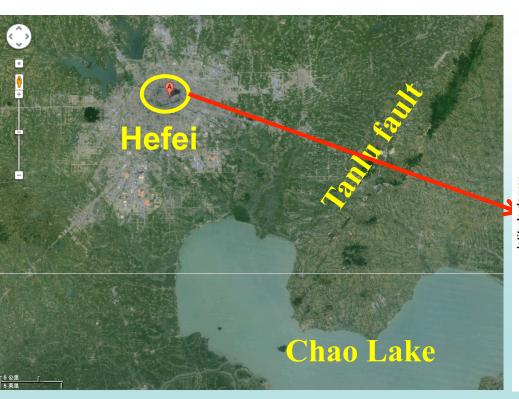
#### 3-D checkerboard resolution test



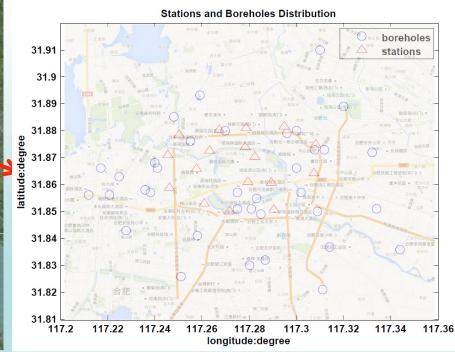
#### Inversion results along 4 profiles



#### (2) Hefei urban area ambient noise tomography



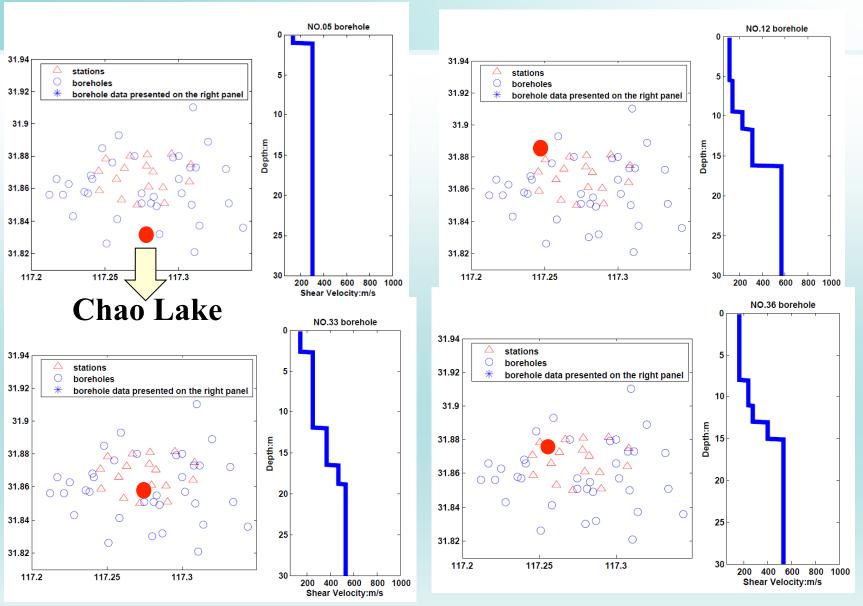
#### 7 km x 5 km



10 km

Station spacing about 0.5-2 km 17 stations, 2 weeks noise recordings

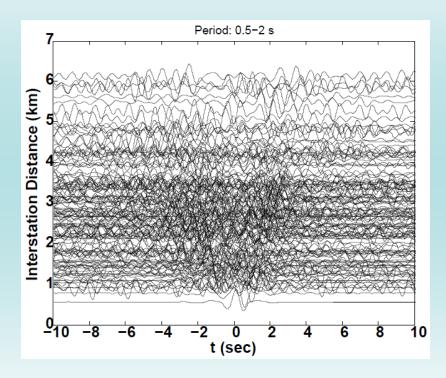
#### 1-D shear wave velocity of boreholes



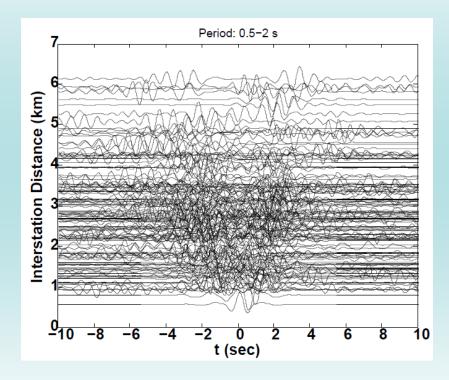
#### **Ambient noise cross-correlation functions**

#### Period band: 0.5 – 2 s Stack hourly data Cross-Correlation Functions

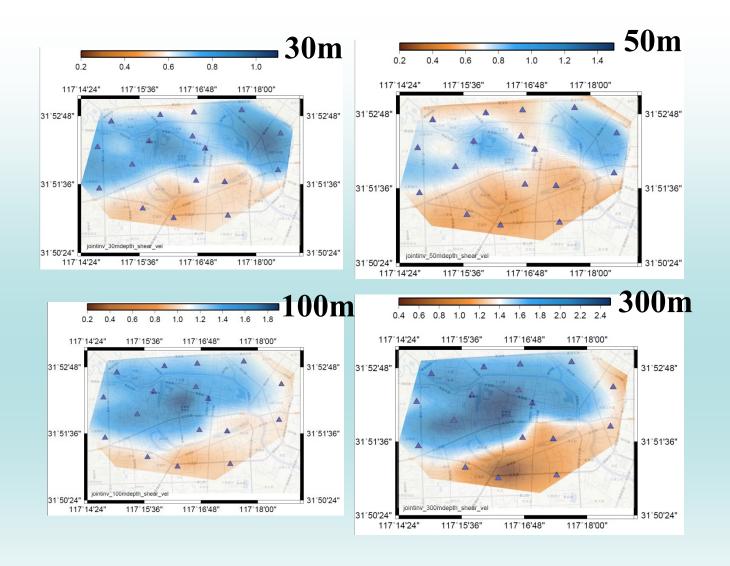
### normalized linear stacking method



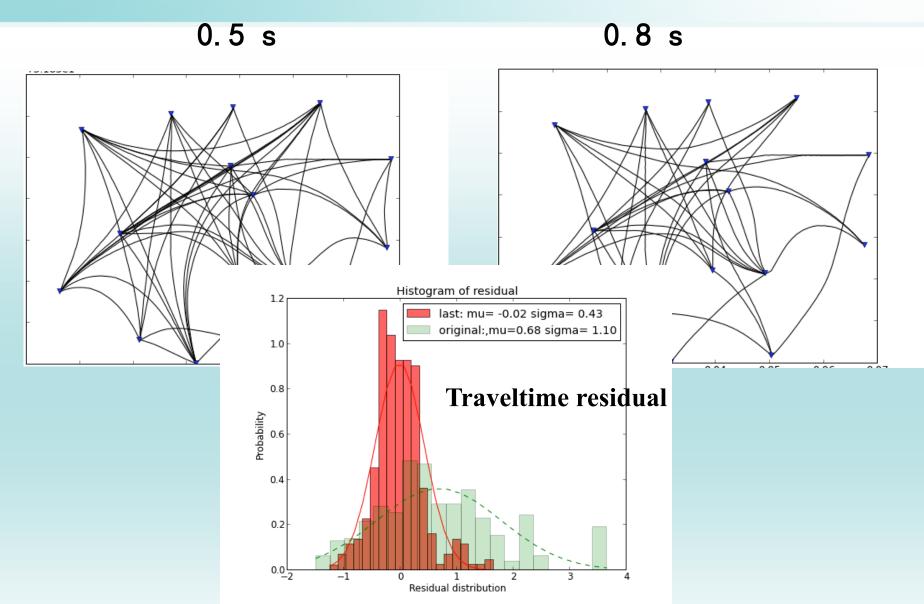
### S-transform stacking method (Schimmel et al.,2011)



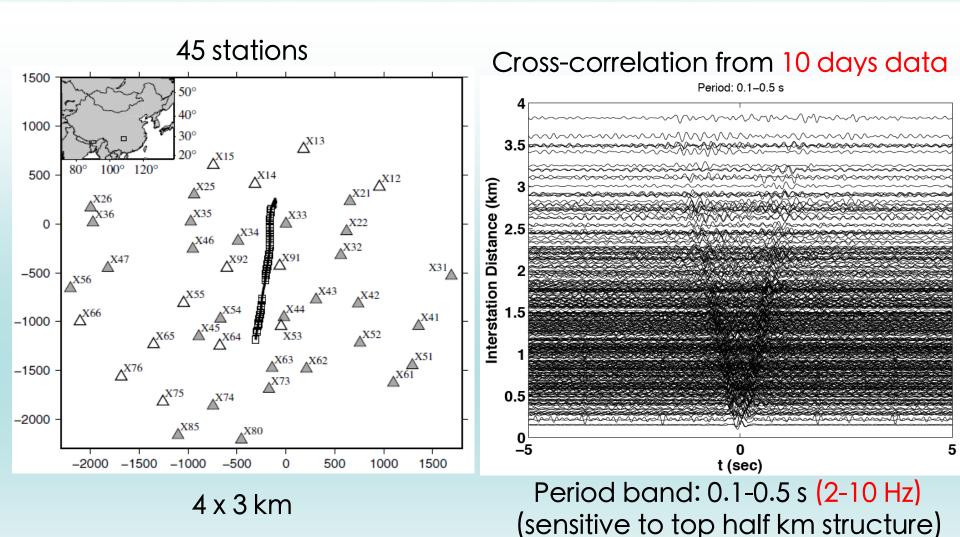
## Joint phase + group travel time inversion results (borehole data are incorporated in the initial model)



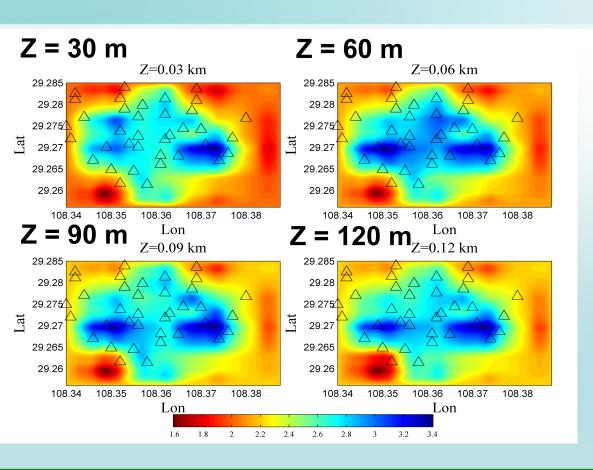
#### Ray path distribution



#### (3) Shale gas production field in SW China



#### Inversion results of Vs from dispersion data



Provide important additional information (other than Vp) for characterizing oil/gas field structure

Provide a good starting model for full elastic waveform modeling and inversion

Topography effects on high-freq. surface wave tomography?

**Topograhic Correction? Full waveform inversion?** 

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## Joint inversion of body wave arrival times and surface wave traveltime data (space domain)

$$egin{bmatrix} \mathbf{G}_{H}^{T_p} & \mathbf{G}_{Vp}^{T_p} & \mathbf{0} \ \mathbf{G}_{H}^{T_s} & \mathbf{0} & \mathbf{G}_{Vs}^{T_s} \ \mathbf{0} & \mu \mathbf{G}_{Vs}^{SW} & \mu \mathbf{G}_{Vs}^{SW} \end{bmatrix} egin{bmatrix} oldsymbol{\Delta}\mathbf{m}_p \ oldsymbol{\Delta}\mathbf{m}_s \end{bmatrix} = egin{bmatrix} \mathbf{d}^{T_p} \ \mathbf{d}^{T_s} \ \end{pmatrix}.$$

- Vp is solved by both first P-arrival times and surface wave data
- Vs is solved by both first S-arrival times and surface wave data

## Joint inversion of body wave traveltime and surface wave traveltime data (wavelet domain)

$$egin{bmatrix} \mathbf{G}_{H}^{T_p} & \mathbf{G}_{Vp}^{T_p} & \mathbf{0} \ \mathbf{G}_{H}^{T_s} & \mathbf{0} & \mathbf{G}_{Vs}^{T_s} \ \mathbf{0} & \mu \mathbf{G}_{Vs}^{SW} & \mu \mathbf{G}_{Vs}^{SW} \end{bmatrix} egin{bmatrix} oldsymbol{\Delta}\mathbf{m}_p \ oldsymbol{\Delta}\mathbf{m}_s \end{bmatrix} = egin{bmatrix} \mathbf{d}^{T_p} \ \mathbf{d}^{T_s} \ \end{pmatrix}.$$

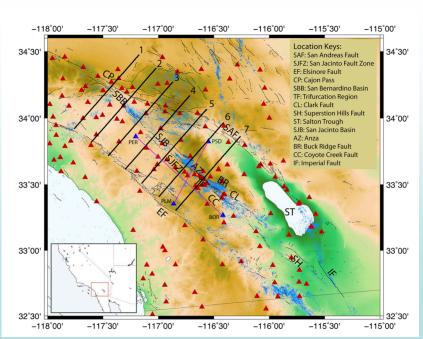
#### Wavelet domain

$$min.||\tilde{\mathbf{G}}\tilde{\mathbf{m}} - \mathbf{d}||_{\mathbf{2}}^{2} + \lambda||\tilde{\mathbf{m}}||_{\mathbf{1}}$$

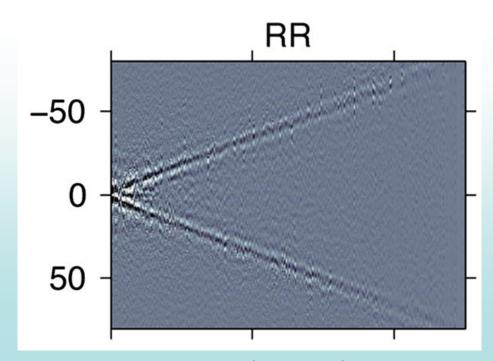
Solved by Iteratively Reweighted Least Square method

$$\mathbf{m} = \mathbf{W}^{-1} \mathbf{\tilde{m}}$$

# Application to San Jacinto Fault Zone (SJFZ) (Preliminary)

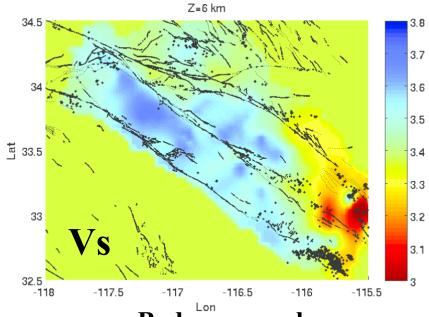


DD tomography (Allam and Ben-Zion, 2012; Allam et al., 2014)

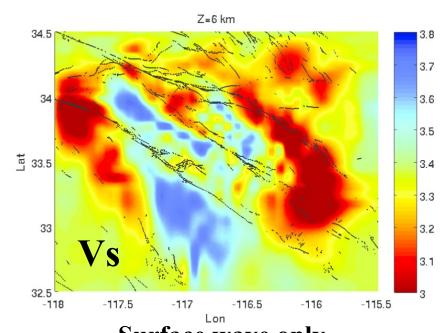


Ambient noise tomography (Rayleigh wave, 3-12s; Zigone et al., 2014)

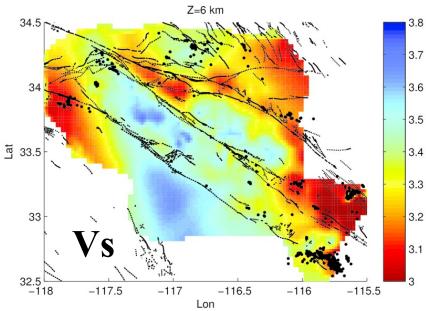
Collaboration with the Ben-Zion's group at USC



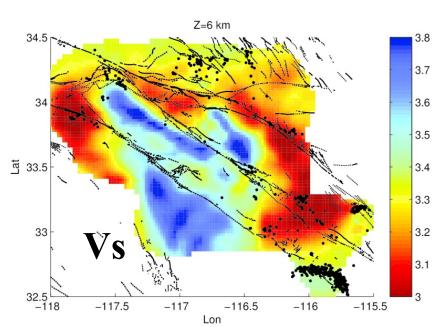
**Body** wave only



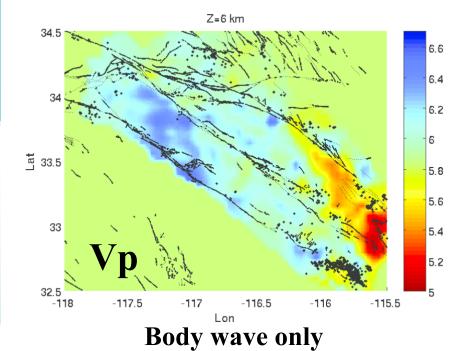
Surface wave only

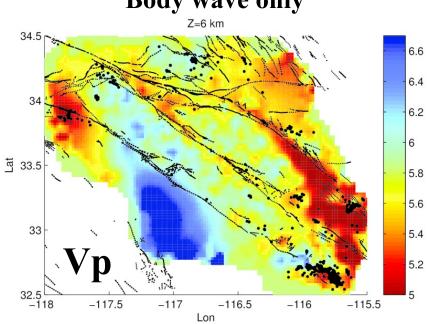


Joint inversion in space domain

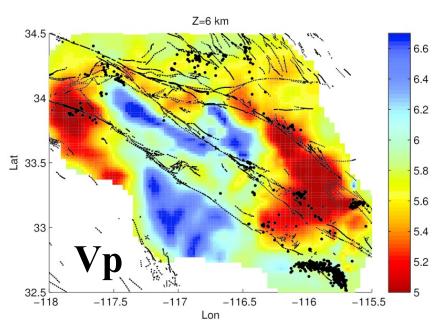


Joint inversion in wavelet domain

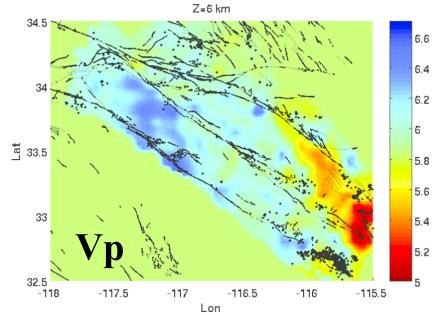




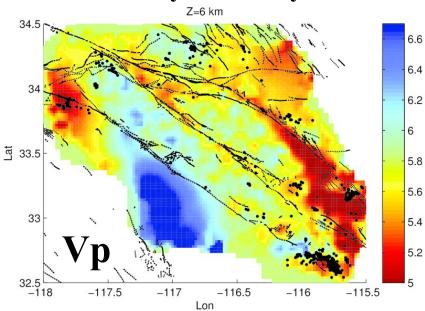
Joint inversion in space domain



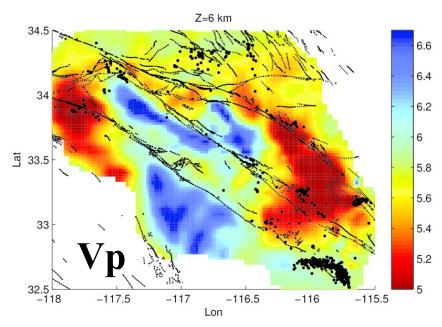
Joint inversion in wavelet domain



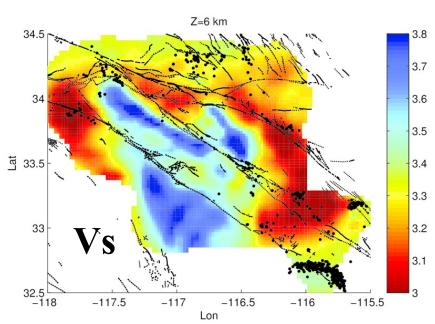
#### **Body wave only**



Joint inversion in space domain



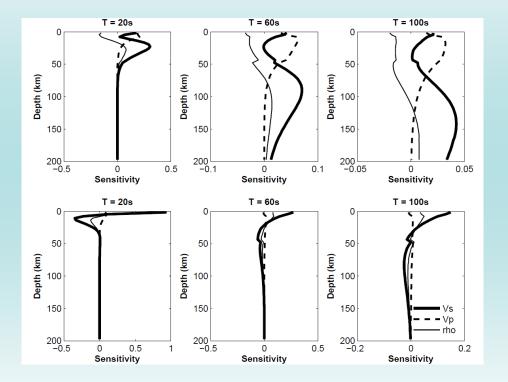
Joint inversion in wavelet domain



Joint inversion in wavelet domain

#### Joint inversion with more dataset

- ZH ratios (Rayleigh wave ellipticity): better constraints on shallow crustal structure and maybe density
- Receiver functions: better constraints on interfaces and average Vp/Vs ratios

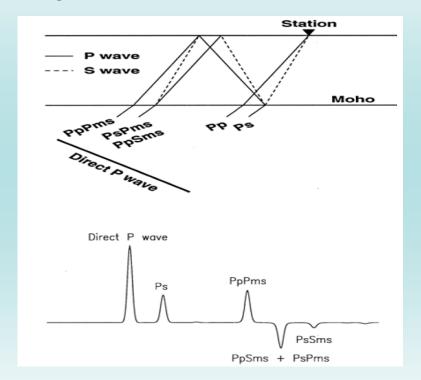


Phase v kernels

ZH ratio kernels

#### Joint inversion with more dataset

- ZH ratios (Rayleigh wave ellipticity): better constraints on shallow crustal structure and maybe density
- Receiver functions: better constraints on interfaces and average Vp/Vs ratios



#### Conclusions

- Joint ambient noise and earthquake surface wave analyses provide better constraints on both crust and upper mantle structure and anisotropy.
- The proposed direct surface wave/ambient noise traveltime tomography for 3-D Vs structure takes accounts for ray bending effects of surface wave at different periods and can provide more accurate estimation of complex shallow crustal structure.
- The joint inversion of surface wave and body wave traveltimes enable us to explore more consistent Vp and Vs models.

# Thank you!

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