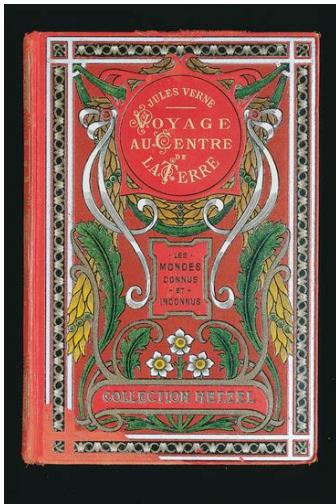


## Introduction to passive imaging and monitoring in seismology

*Material from the chapter « Noise correlations » by Campillo and Roux, Treatise of Geophysics 2013*

Michel Campillo,  
ISTerre  
*Université Joseph Fourier and CNRS, 38041 Grenoble, France*

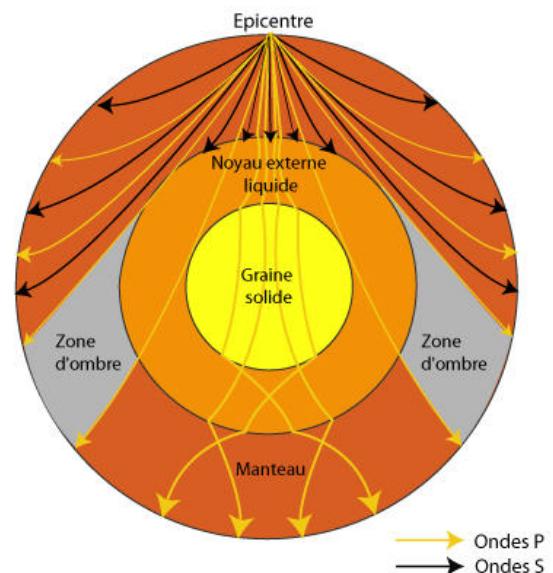
*Cargèse 2013*

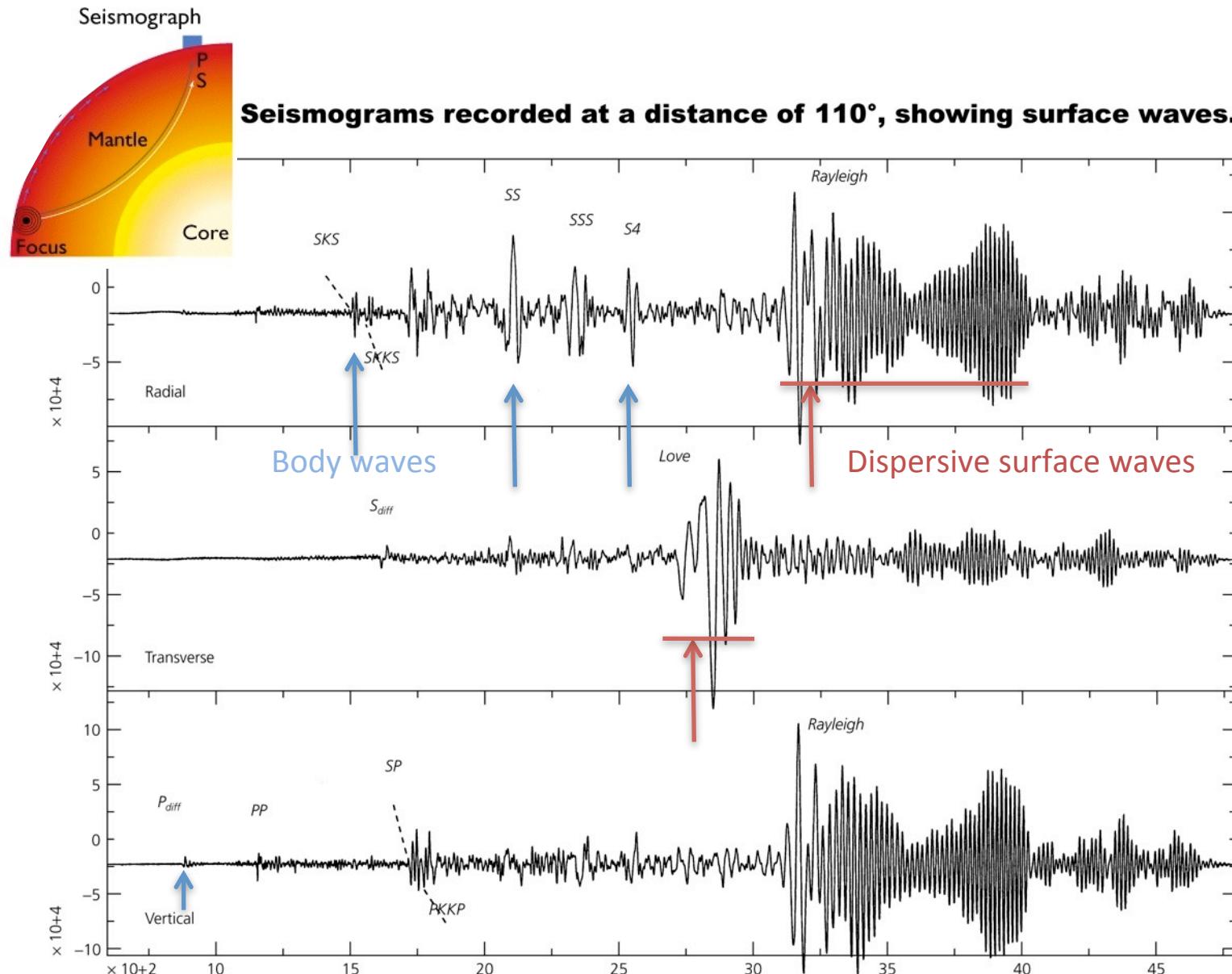


-Introduction

-Passive imaging

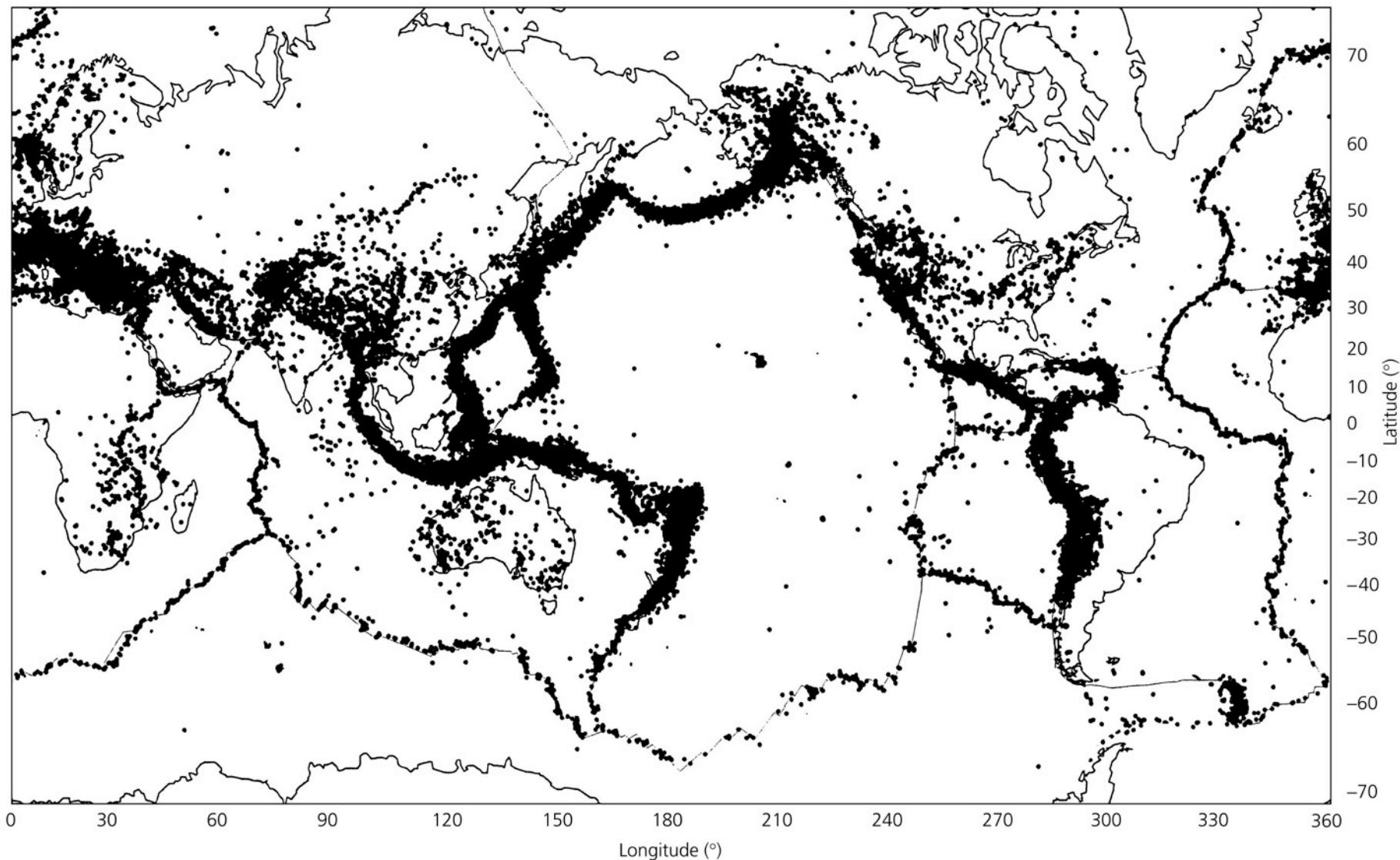
-Monitoring the changing Earth



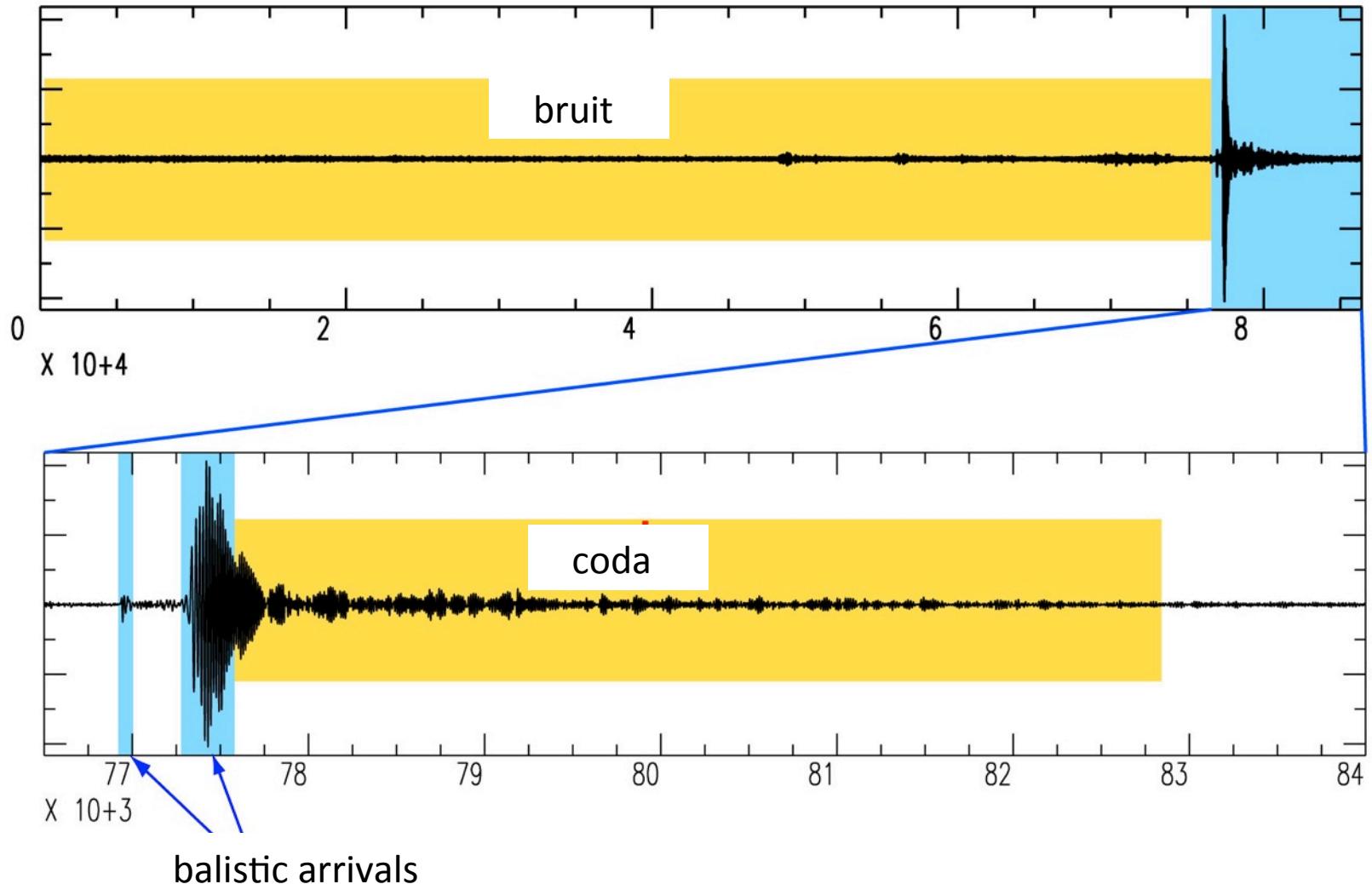


From Stein and Wysession

**Figure 1.2-1: Global seismicity, 1963-1995.**

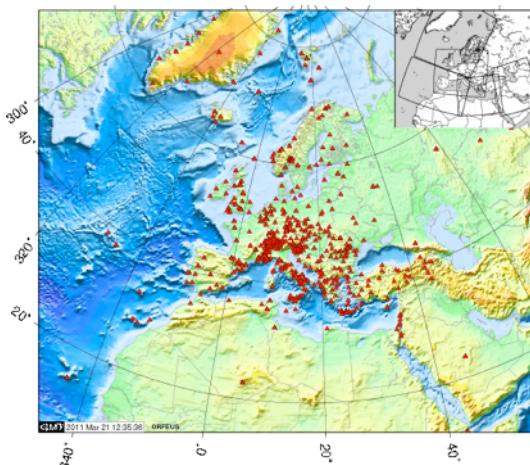
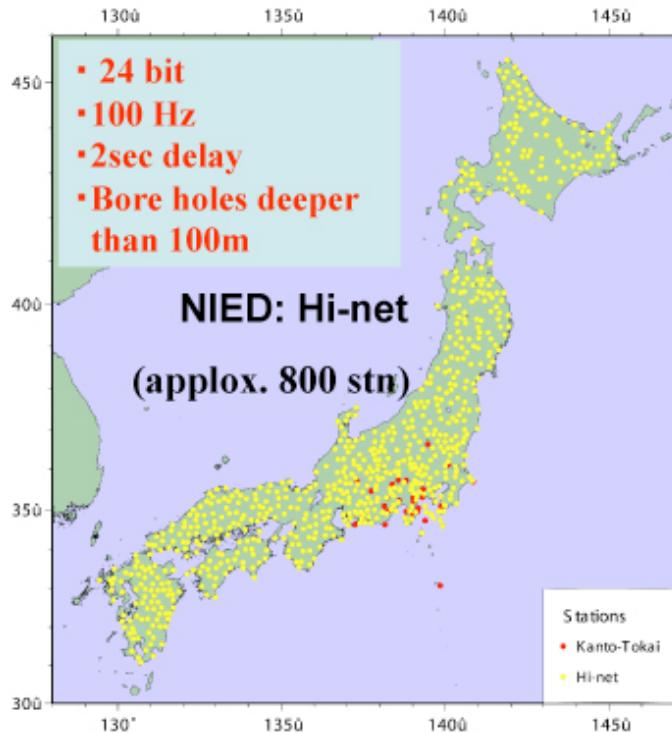


## Une journée AVEC un grand séisme



The coda is the result of multiple scattering

## Large networks – continuous recordings



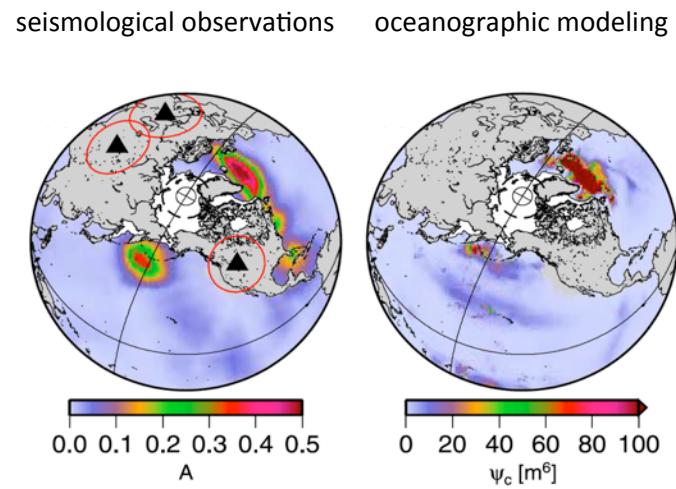
Seismology : huge data sets consisting for a large part of 'ambient noise'..

*Exploration data and more : J. Meunier*

## Global ‘noise’ sources in the microseism band (extended $\approx$ 2-50s)

Strong contribution from oceanic waves

Example of a global comparison



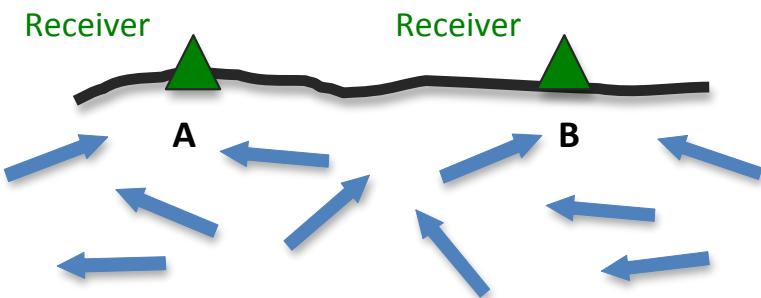
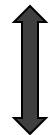
Hillers et al., 2012

*(presentation by F. Arduin)*



Source in A  $\Rightarrow$  the signal recorded in B characterizes the propagation between A and B.

→ **Green function** between A and B:  $G_{AB}$



$G_{AB}$  can be reconstructed by the correlation of noise or « diffuse » (equipartitioned) fields recorded at A and B ( $C_{AB}$ )

Experimentally verified with seismological data (Campillo and Paul, 2003; Shapiro and Campillo, 2004,.....)

## Definitions

-Crosscorrelation of the signals  $u_1(t)$  at  $\vec{r}_1$  and  $u_2(t)$  at  $\vec{r}_2$

$$C(\vec{r}_1, \vec{r}_2; t) = C_{1,2}(t) = \frac{1}{T} \int_0^T u_1(\tau) u_2(t + \tau) d\tau$$

and in the frequency domain:  $C(\vec{r}_1, \vec{r}_2; \omega) = C_{1,2}(\omega) = u_1(\omega) u_2^*(\omega)$

-Green function (source at origin):

$$\Delta G(\vec{x}; t) - \frac{1}{c^2} \frac{\partial G(\vec{x}; t)}{\partial t^2} = \delta(\vec{x}) \delta(t)$$

-Causality and Fourier transform:

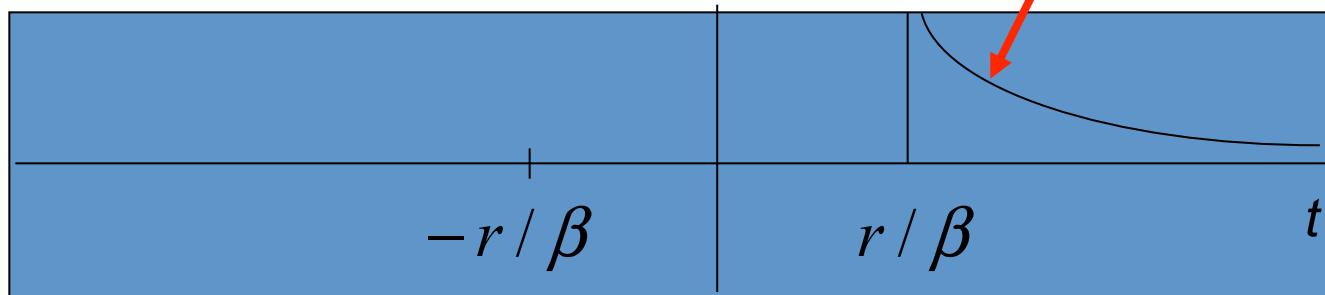
$$\text{Im}(G(\omega)) = \frac{1}{2i} (G(\omega) - G^*(\omega))$$

$$TF(i \text{Im}(G(\omega))) = \frac{1}{2} (G(t) - G(-t))$$

## Causality: the example of the 2D scalar Green function

$$G(\omega) = \frac{1}{4i\mu} H_0^{(2)}\left(\frac{\omega r}{\beta}\right)$$

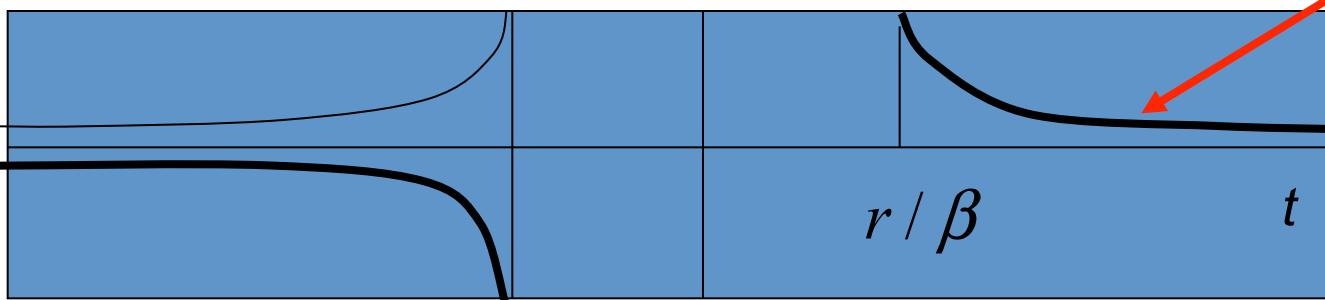
$$G(t) = \frac{1}{2\pi\mu} \frac{H\left(t - \frac{r}{\beta}\right)}{\sqrt{t^2 - \frac{r^2}{\beta^2}}}$$



**G/2**

**FT(Re(G))**

**FT(i Im(G))**



$$TF(i \operatorname{Im}(G(\omega))) = \frac{1}{2}(G(t) - G(-t))$$

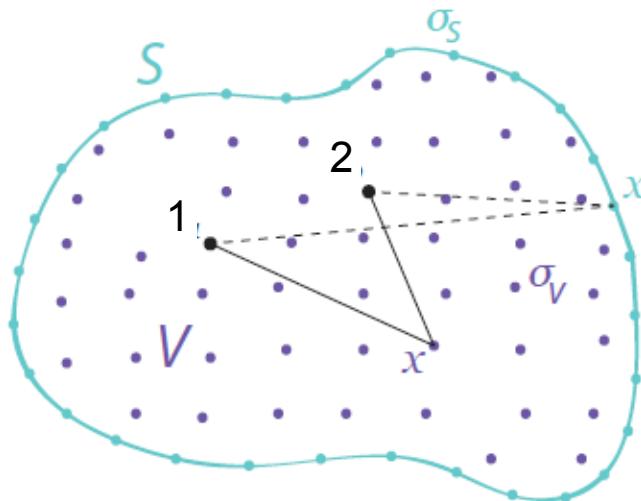
Arbitrary medium: an integral representation written in the frequency domain

(see e.g. Weaver et al. 2004, or Snieder, 2007)

$$G_{12} - G_{12}^* = \frac{4i\omega\kappa}{c} \int_V G_{1x} G_{2x}^* dV + \oint_S [G_{1x} \vec{\nabla}(G_{2x}^*) - \vec{\nabla}(G_{1x}) G_{2x}^*] d\vec{S}$$

Volume term                                      Surface term





Helmholtz equation  $G_{1x} = G(\vec{r}_1, \vec{x}; \omega)$

$$\Delta G_{1x} + V(\vec{x})G_{1x} + (k + i\kappa)^2 G_{1x} = \delta(\vec{x} - \vec{r}_1)$$

where the potential  $V(\vec{x})$  describes the scattering contribution does not extend to infinity.

As for the classical representation theorem, we consider a combination of the fields from source at 1 and 2 and compute the flux:

$$I = \oint_S \left[ G_{1x} \vec{\nabla} \left( G_{2x}^* \right) - \vec{\nabla} \left( G_{2x} \right) G_{1x}^* \right] d\vec{S}$$

With the divergence theorem:

$$I = \int_V \vec{\nabla} \left[ G_{1x} \vec{\nabla} \left( G_{2x}^* \right) - \vec{\nabla} \left( G_{2x} \right) G_{1x}^* \right] dV$$

$$I = \int_{\mathcal{V}} \vec{\nabla} \left[ G_{1x} \vec{\nabla} \left( G_{2x}^* \right) - \vec{\nabla} \left( G_{1x} \right) G_{2x}^* \right] dV \quad \text{reduces to}$$

$$I = \int_{\mathcal{V}} \left( G_{1x} \Delta G_{2x}^* - \Delta G_{1x} G_{2x}^* \right) dV$$

Using the definition of the GF:

$$\Delta G_{1x} = \delta(\vec{x} - \vec{r}_1) - V(\vec{x}) G_{1x} - (k + i\kappa)^2 G_{1x}$$

we obtain:

$$I = G_{12} - G_{21}^* - \frac{4i\omega\kappa}{c} \int_{\mathcal{V}} G_{1x} G_{2x}^* dV$$

and finally:

$$G_{12} - G_{12}^* = \frac{4i\omega\kappa}{c} \int_{\mathcal{V}} G_{1x} G_{2x}^* dV + \oint_S \left[ G_{1x} \vec{\nabla} \left( G_{2x}^* \right) - \vec{\nabla} \left( G_{1x} \right) G_{2x}^* \right] \overrightarrow{dS}$$

Surface term: 
$$G_{12} - G_{12}^* = \oint_S \left[ G_{1x} \vec{\nabla} \left( G_{2x}^* \right) - \vec{\nabla} \left( G_{1x} \right) G_{2x}^* \right] d\vec{S}$$

$\kappa = 0$  (no attenuation)

No source in the bulk

Surface term:

$$G_{12} - G_{12}^* = \oint_S \left[ G_{1x} \vec{\nabla} (G_{2x}^*) - \vec{\nabla} (G_{1x}) G_{2x}^* \right] \overrightarrow{dS}$$

If the surface is taken in the far field of the medium heterogeneities

$$G_{1x} \sim \frac{1}{4\pi |\vec{x} - \vec{r}_1|} \exp(-ik|\vec{x} - \vec{r}_1|) \text{ and } \vec{\nabla} (G_{1x}) \sim ik G_{1x}$$

and we obtain another widely used integral relation:

$$G_{12} - G_{12}^* = -2i \frac{\omega}{c} \oint_S G_{1x} G_{2x}^* dS$$

Talk by A. Curtis on integral representations and applications

Volume term:  $G_{12} - G_{12}^* = \frac{4i\omega\kappa}{c} \int_v G_{1x} G_{2x}^* dV$

$\kappa$  is finite (attenuation)

S is assumed to be sufficiently far away, for its contribution to be neglected (spreading and attenuation)

# An homogeneous infinite body with an even random distribution of sources

Green function

$$G(\vec{r}_1, \vec{r}_2; t) = \frac{1}{2\pi} \int_{-\infty}^{+\infty} d\omega \frac{1}{4\pi |\vec{r}_2 - \vec{r}_1|} \exp\left[i\omega\left(t - \frac{|\vec{r}_2 - \vec{r}_1|}{c}\right)\right] \exp(-\kappa |\vec{r}_2 - \vec{r}_1|)$$

Contribution from  
Random sources

$$P(\vec{r}_1; t) = \int_{-\infty}^{\infty} \int_{-\infty}^t d\vec{x} dt_x S(\vec{x}, t_x) G(\vec{r}_1, \vec{x}; t - t_x)$$

$$\langle S(\vec{x}, t_x) S(\vec{x}', t_{x'}) \rangle = Q^2 \delta(t_x - t_{x'}) \delta(\vec{x} - \vec{x}')$$

Correlation with finite duration

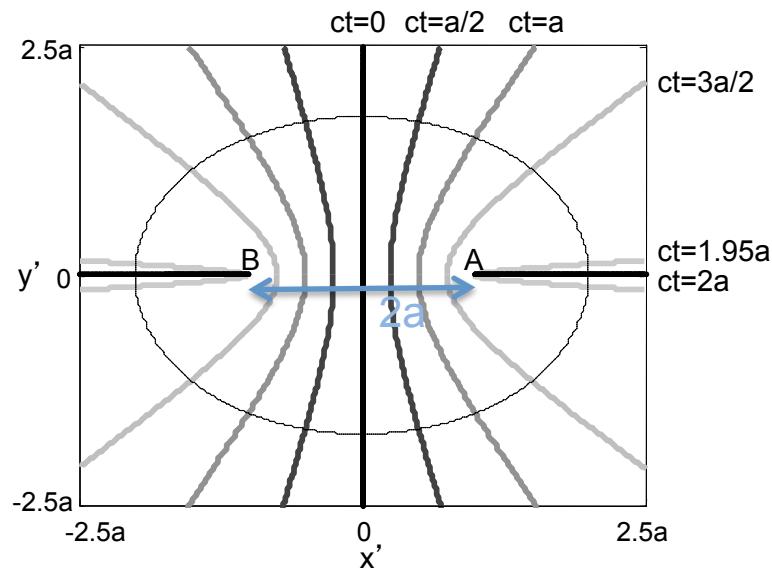
$$C(\vec{r}_1, \vec{r}_2; t) = C_{1,2}(t) = \frac{1}{T} \int_0^T P(\vec{r}_1; \tau) P(\vec{r}_2; t + \tau) d\tau$$

$$\frac{d}{dt} \langle C_{1,2}(t) \rangle = Q^2 N \frac{c}{2\kappa} [G(\vec{r}_1, \vec{r}_2; t) - G(\vec{r}_1, \vec{r}_2; -t)] \quad \text{with } Q^2 N \text{ being the noise power during T}$$

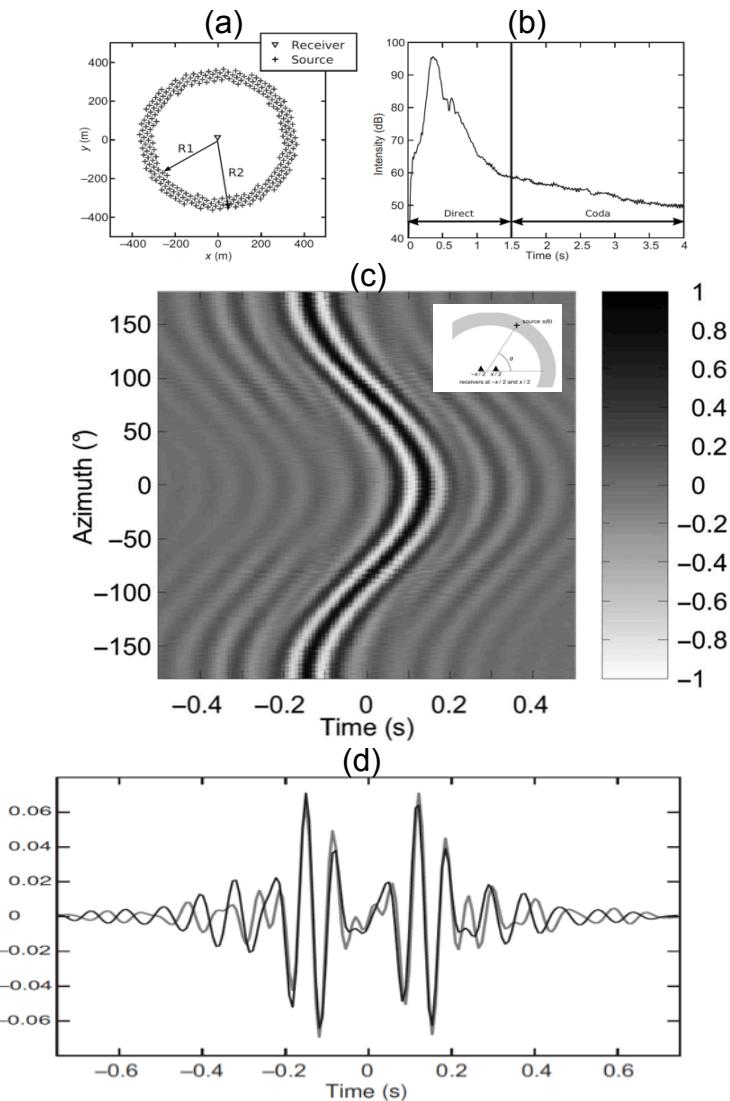
<time derivative of correlation>  $\approx$  causal+acausal Green functions

Location of the sources that contribute to the correlation: the end fire lobes

Difference of travel time between A and B  
wrt the position of the source



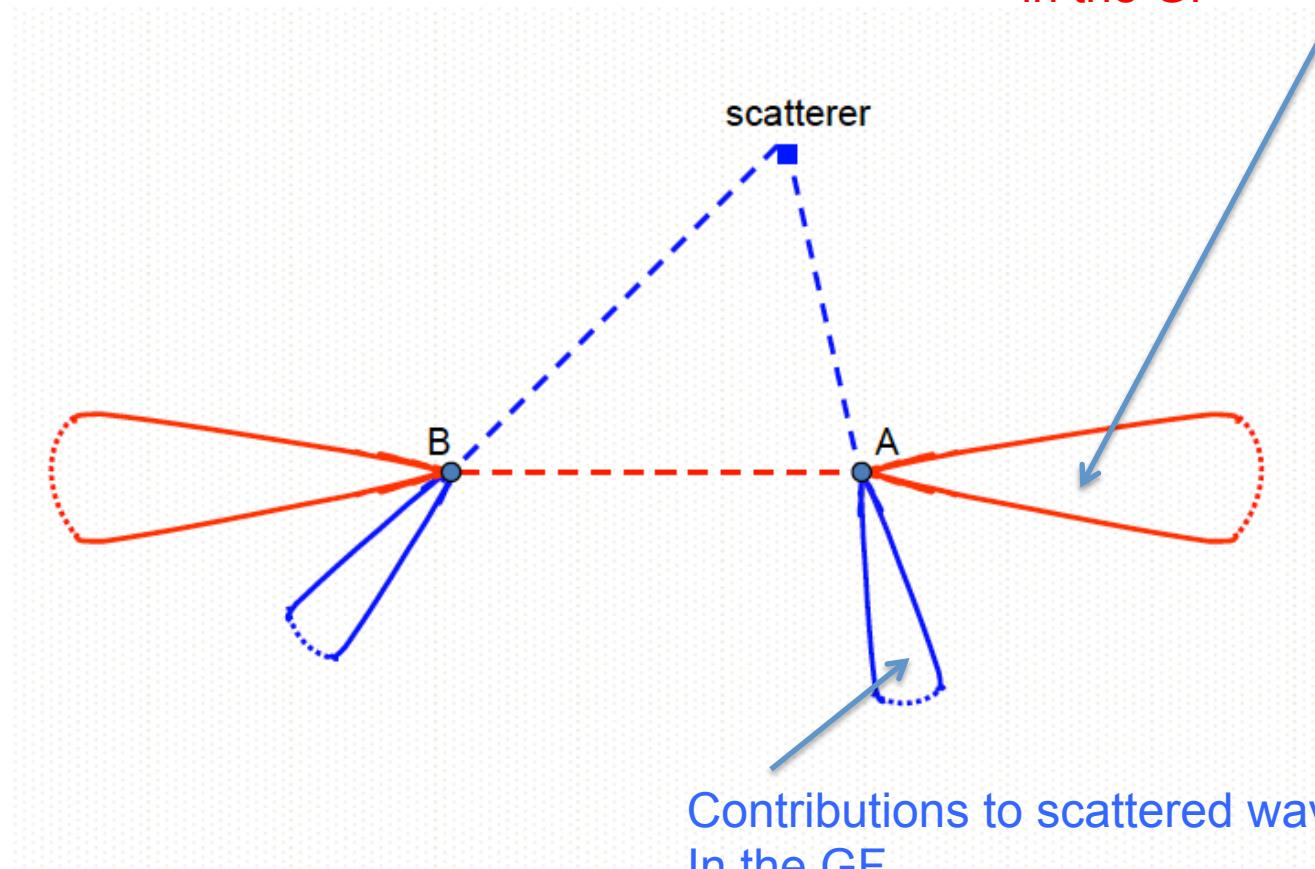
# Stationary phase and end fire lobes



From Gouédard et al., 200X

End fire lobes

Contributions to direct waves  
in the GF



Extension to scattered waves

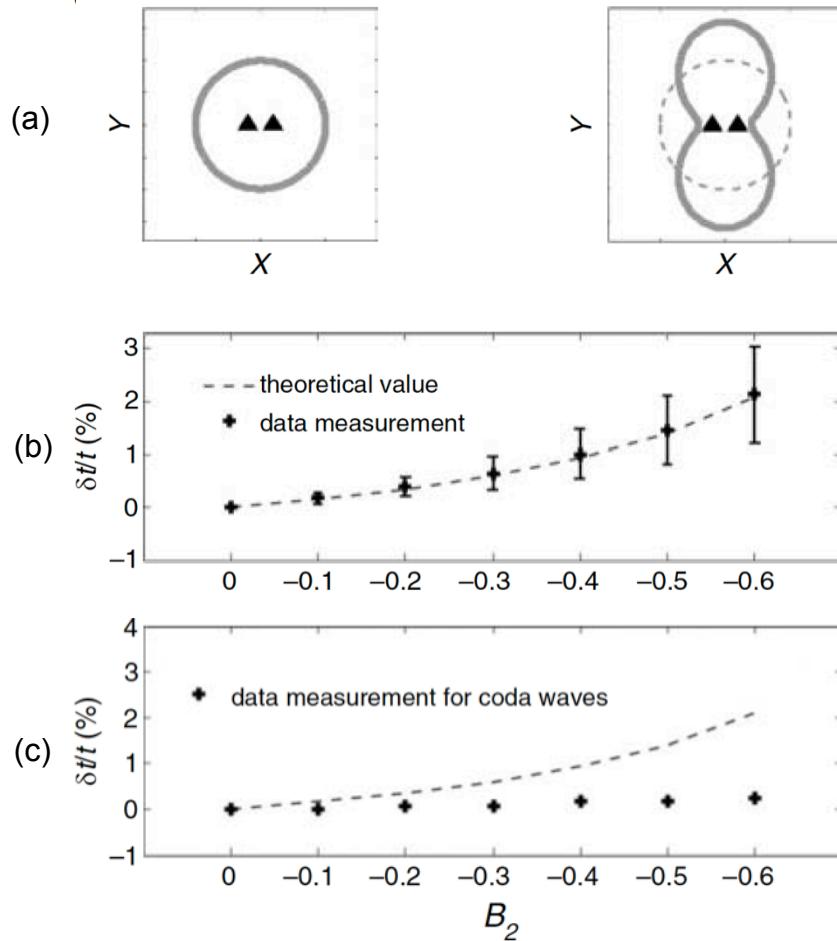
Talks by H. Sato and J. Garnier

In practice, the noise sources are not evenly distributed and the field is not equipartitioned.

At first order we can study the effect of non isotropy of the field incident on the receivers.

It results in bias on the measurements of direct path travel times.

Increasing anisotropy of the noise intensity  $B$



$$B(\theta) = 1 + B_2 \cos(2\theta)$$

Bias in the correlation of direct waves

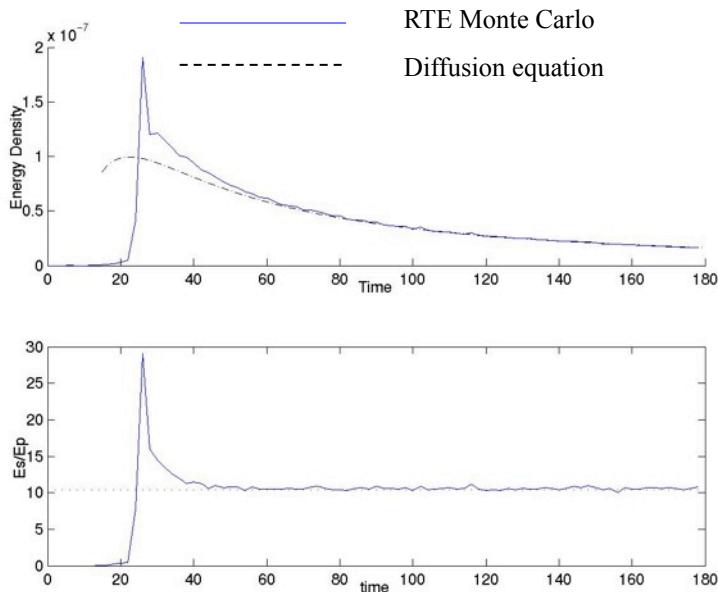
Bias in the correlation of coda waves

# Multiple scattering and equipartition

Equipartition principle for a completely randomized (diffuse) wave-field: in average, all the modes of propagation are excited to equal energy.

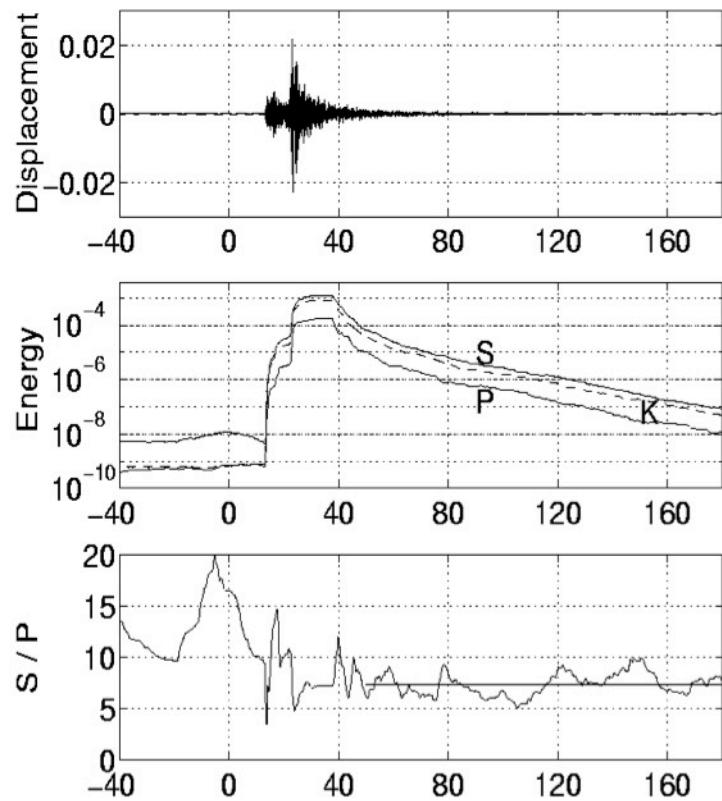
Implication for diffuse elastic waves (*Weaver, 1982, Ryzhik et al., 1996*): P to S energy ratio stabilizes at a value independant of the details of scattering.

Numerical simulation (*Margerin et al. 2000*)



Observations (*Hennino et al., 2001*)

Event 11



## Multiple scattering and equipartition (finite body)

equipartition

$$\phi(\vec{r}; t) = \sum_n a_n U_n(\vec{r}) \cos(\omega_n t)$$
$$\langle a_n a_m^* \rangle = F(\omega_n) \delta_{nm}$$

correlation

$$C_{1,2}(t) = \frac{1}{T} \int_0^T \phi(\vec{r}_1, \tau) \phi(\vec{r}_2, t + \tau) d\tau$$

Assuming a long recording interval  $T$ , this reduces to:

$$C_{1,2}(t) = \frac{1}{2} \sum_n F(\omega_n) U_n(\vec{r}_1) U_n(\vec{r}_2) \cos(\omega_n t)$$

Compare with:

$$G(\vec{r}_1, \vec{r}_2; t) = \sum_n U_n(\vec{r}_1) U_n(\vec{r}_2) \frac{\sin(\omega_n t)}{\omega_n} \Theta(t)$$

1 derivative

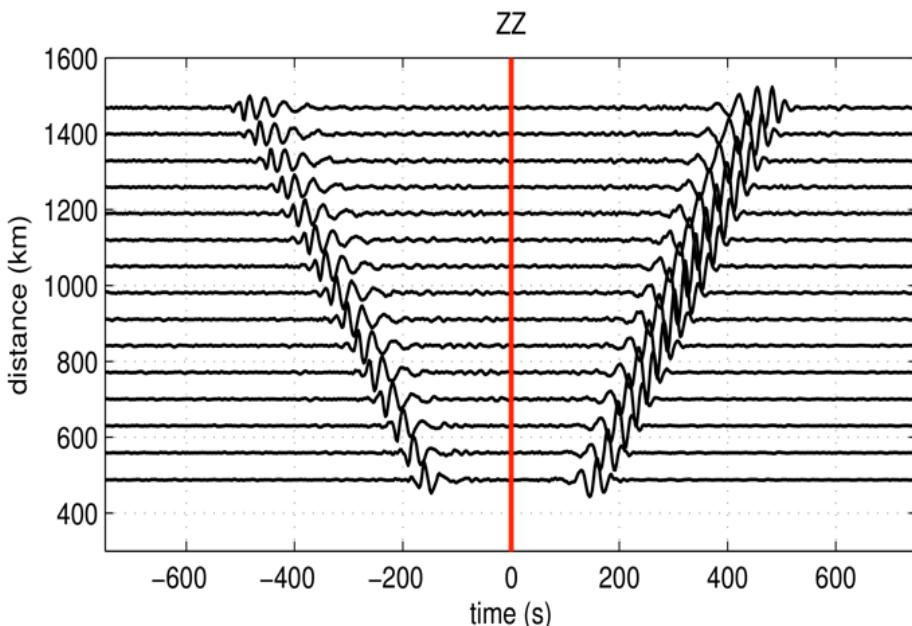
2 causality

The ‘correlation relation’ (under the hypothesis of random sources or multiple scattering):

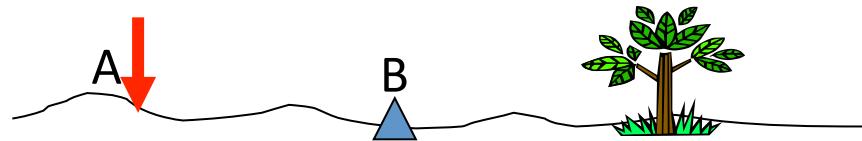
$$\partial_\tau C_{AB}(\tau) \propto G^+(A, B, \tau) - G^-(A, B, -\tau)$$

Correlation of fields in A and B

Green function between A and B  
(for positive and negative times)



Superposition of  $G(t)$  and  $G(-t)$ .....



Rayleigh waves across USArray  
(from P. Boué, UJF)

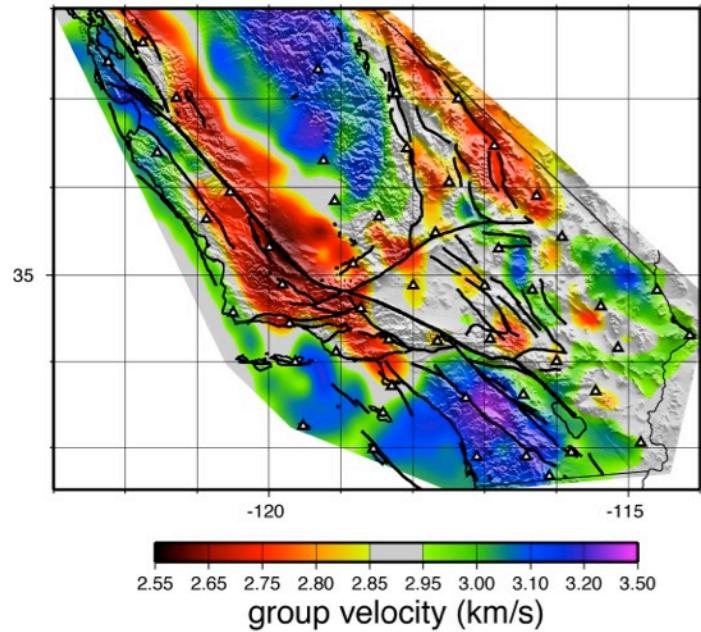
-Introduction

## **-Passive Imaging**

-Suivre les évolutions de la terre solide

# Surface wave imaging with seismic noise..... it works

Map of Rayleigh group velocity Vg  
(linear inversion)  
18 s cross-correlation

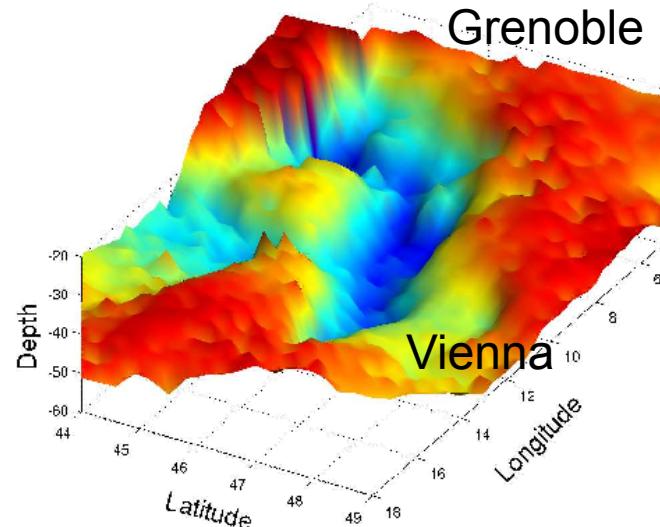


Shapiro et al. Science 2005.

3D shear velocity model

- 1)  $Vg(x,y,T)$
- 2)  $Vs(x,y,z)$  local non linear inversion

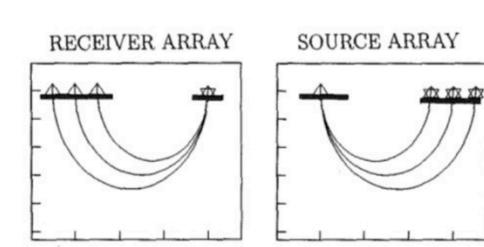
*The Moho beneath the Alps*



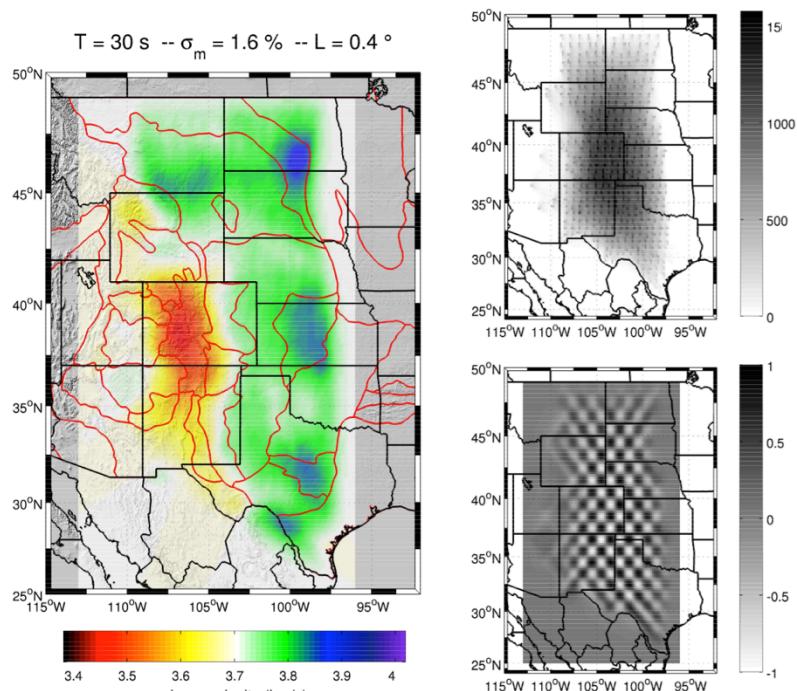
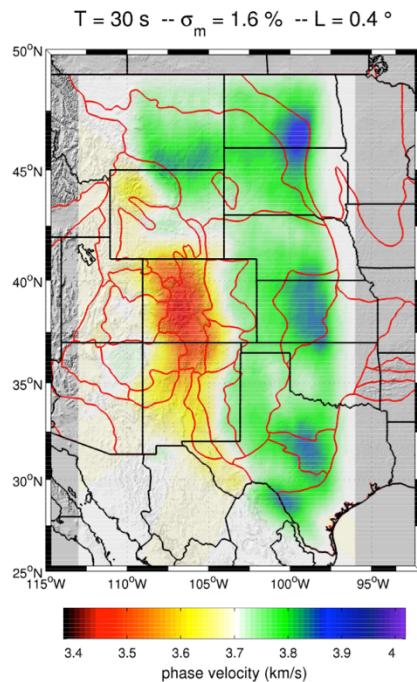
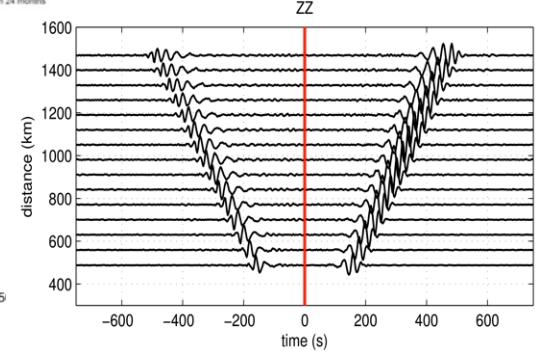
Stehly et al. , 2009

# Refined imaging within a large array

(Pierre Boué 2013)



Weber et al., 1996



With ray bending

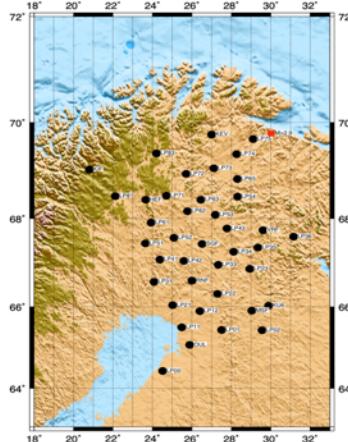
Presentations by R. van der Hilst and G. Prieto

Surface wave tomography → body waves (deep reflections)

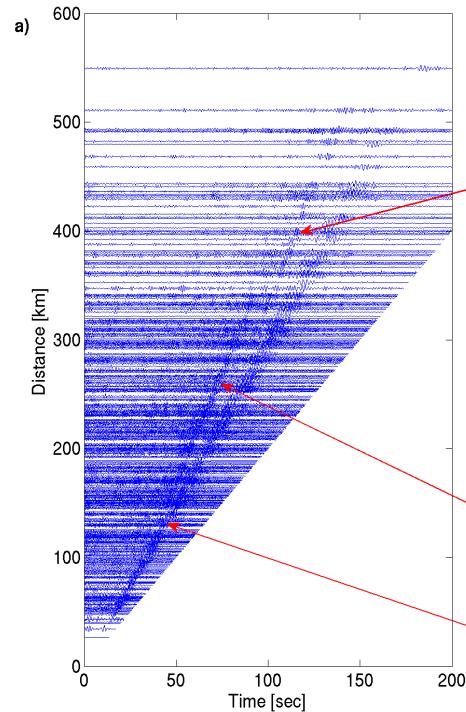
Comparison of high frequency (1Hz) 1-year noise correlation with  
earthquake data

Poli et al. 2012a

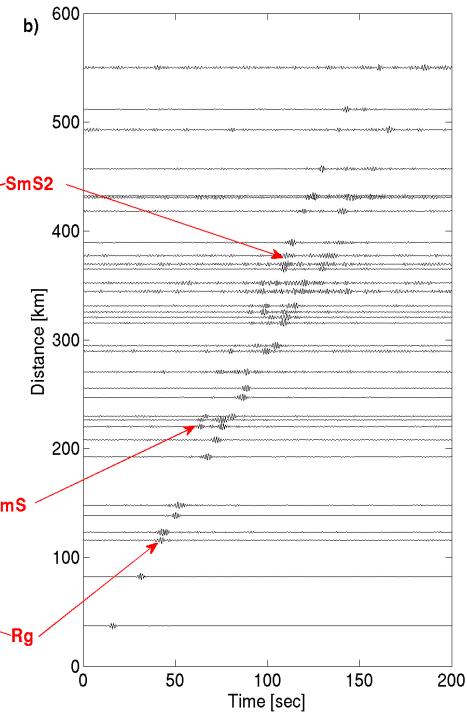
POLENET/LAPNET array in Finland



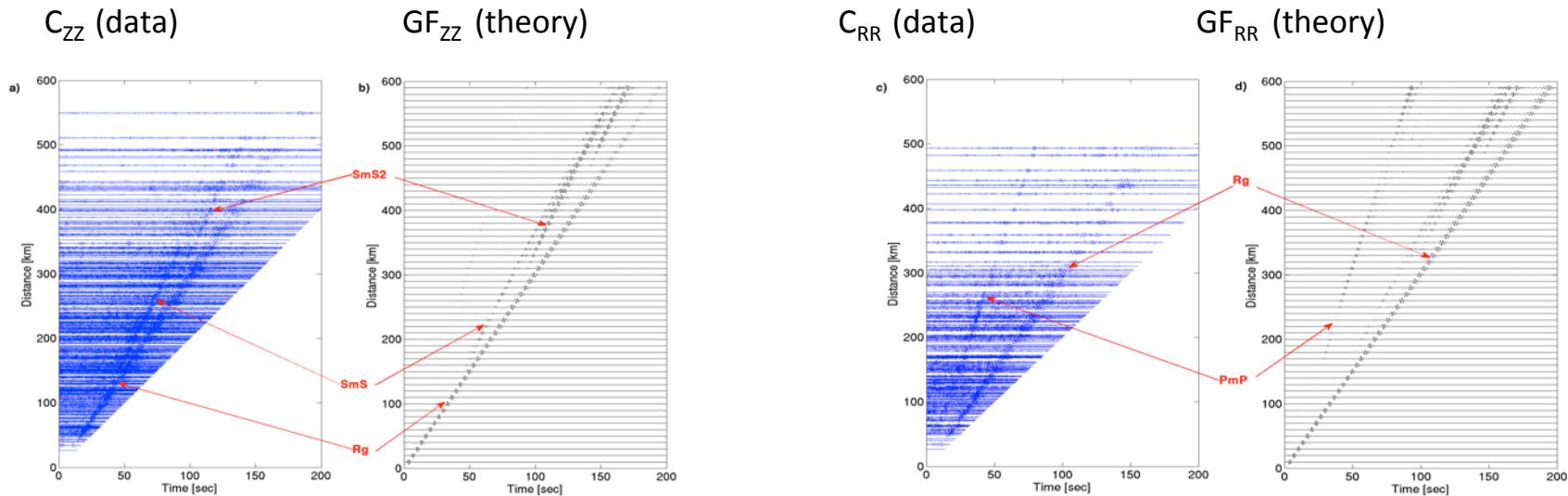
Z-Z noise correlations



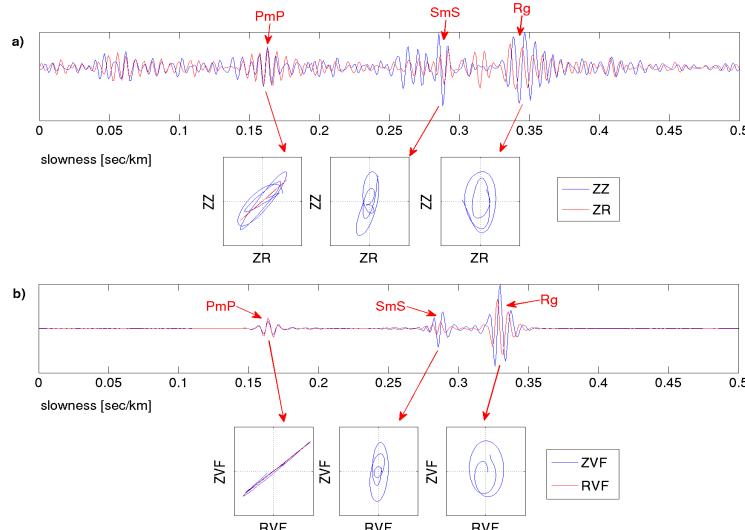
Z comp. actual earthquake



# Comparison with synthetic Green functions



Polarisation: noise correlation vs synthetics



## Reconstruction of $P$ and $S$ multiple reflections

Good reconstruction of phase and relative amplitudes of the components of the reflected waves. (amplitude discussed by Prieto)

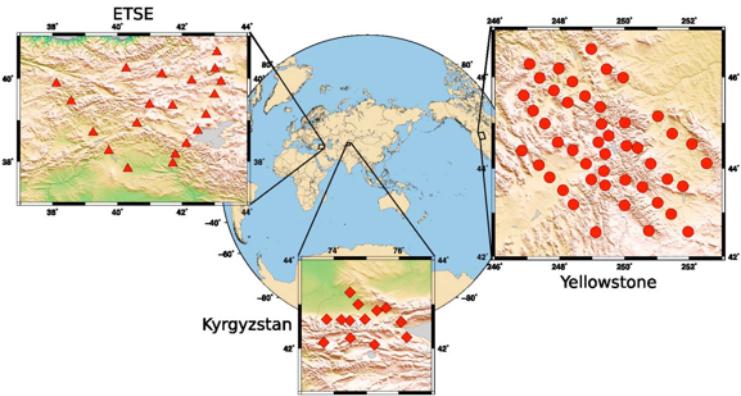
A favorable context: distance vs. mean free path, amplitude in actual earthquake records

→ Deep phases

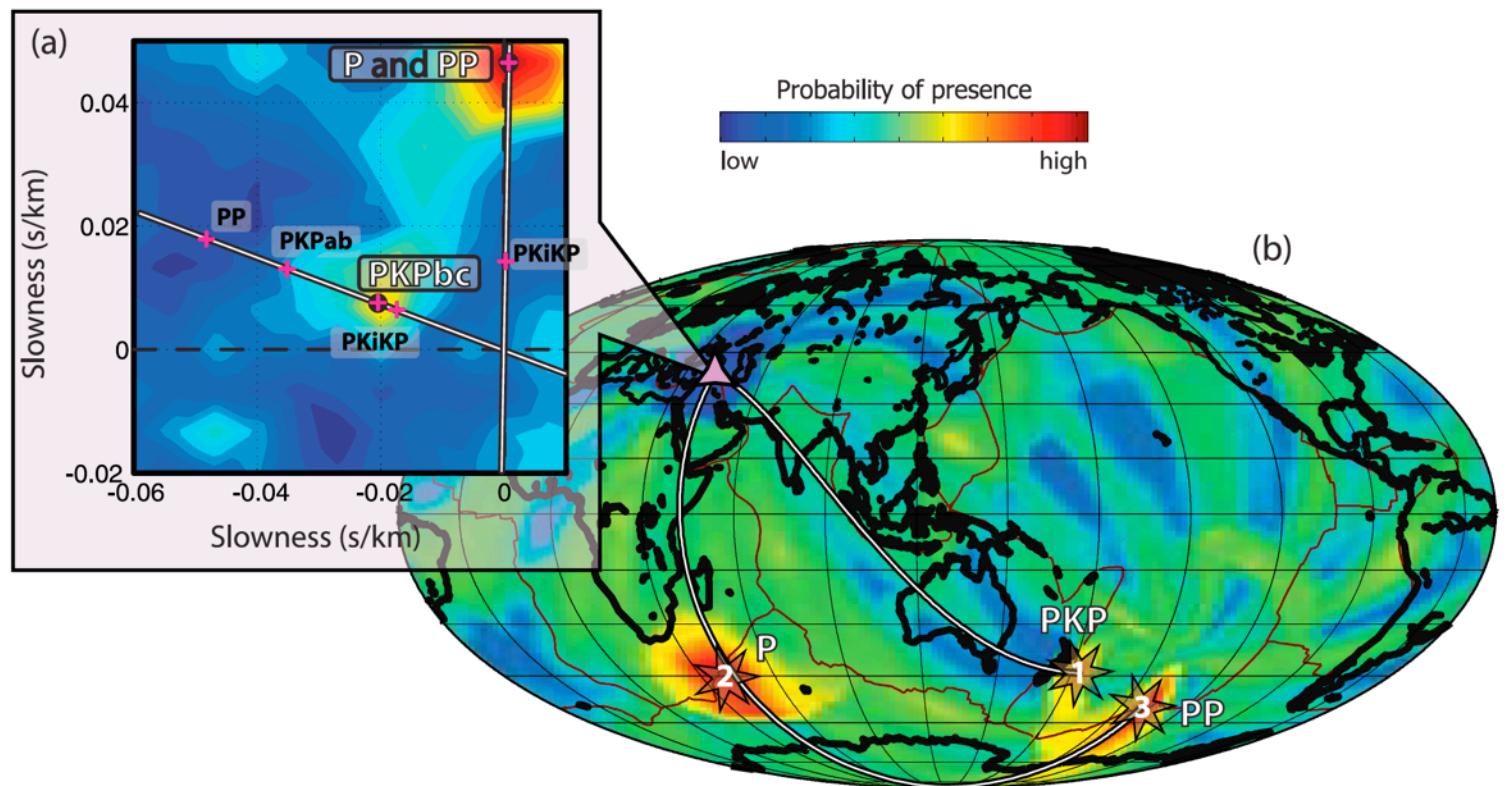


# Ambient noise Array analysis

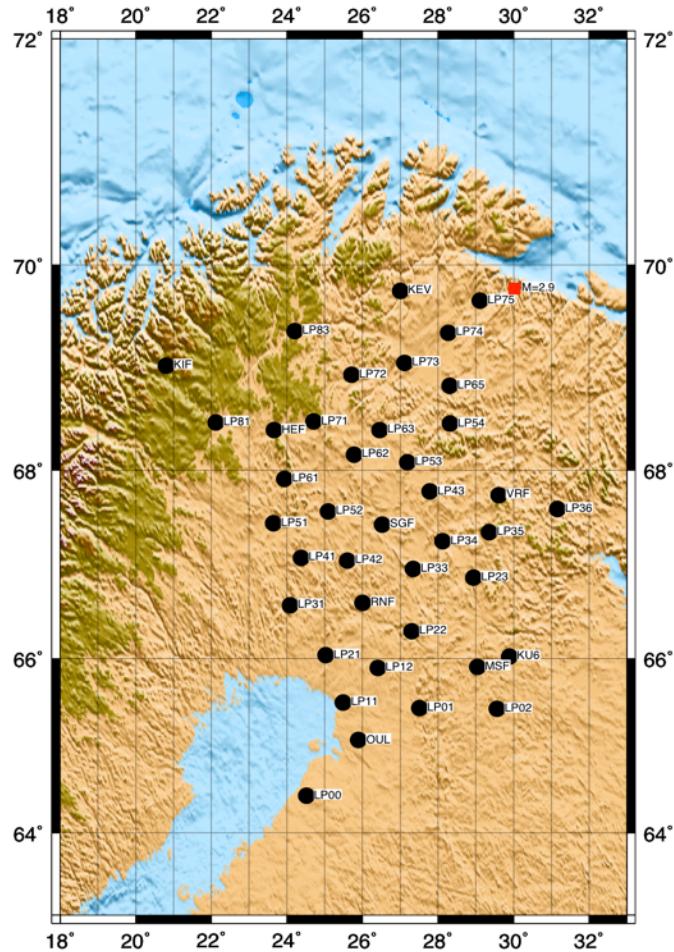
*Landès et al., 2010*



High apparent velocity arrivals: deep phases

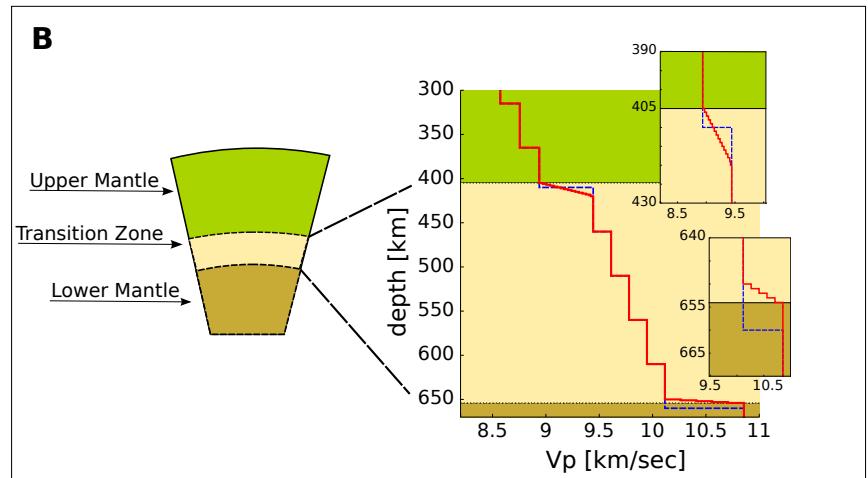
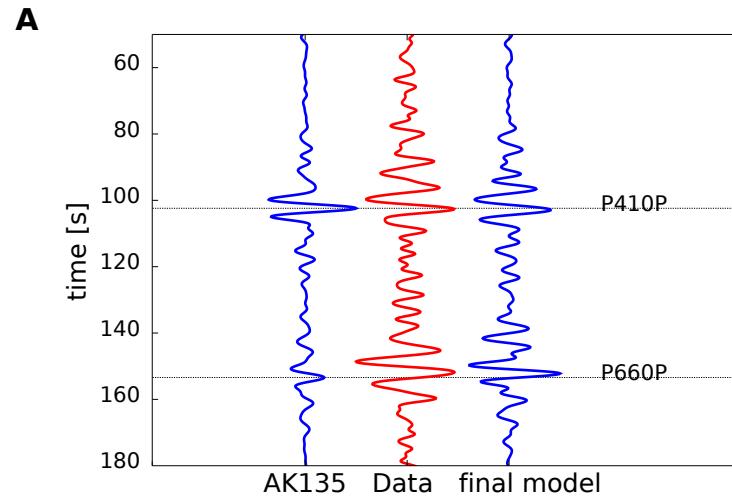
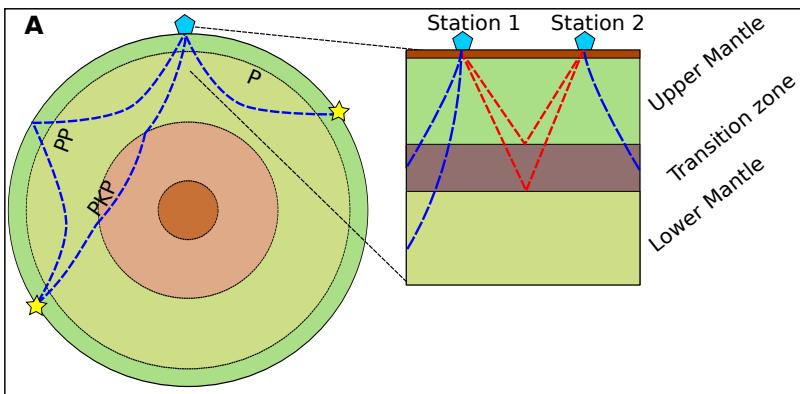


## POLENET/LAPNET array

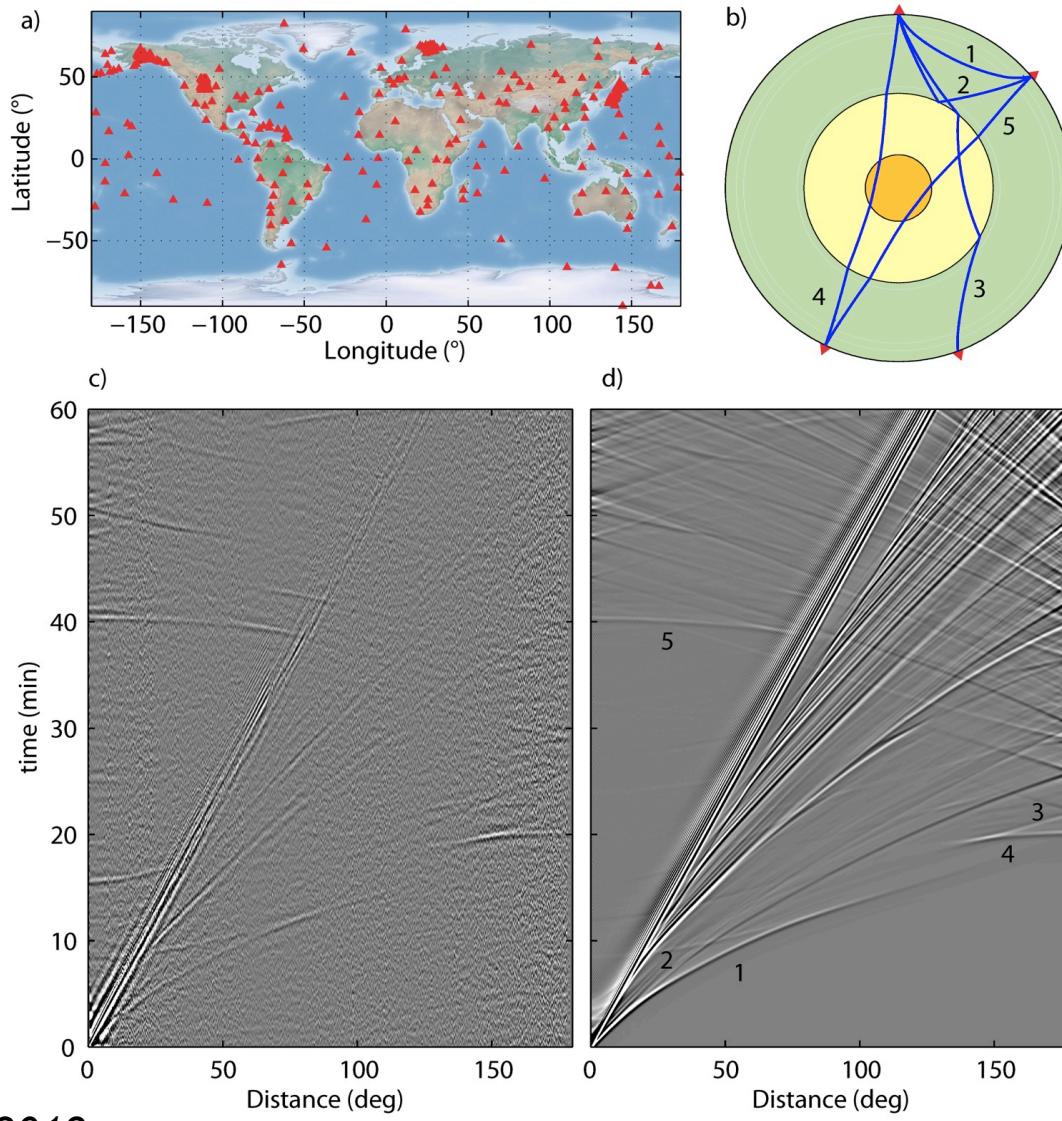


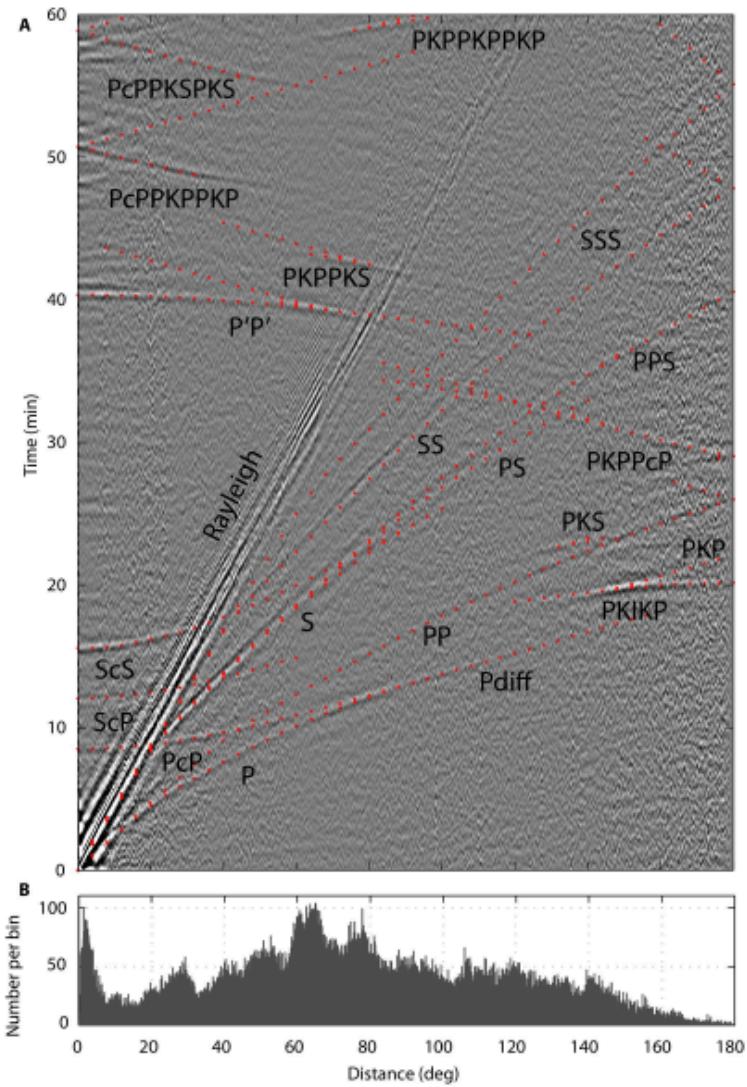
## →Earth's mantle discontinuities from ambient seismic noise (crystalline phase transition → (P,T))

Poli et al. Science 2012

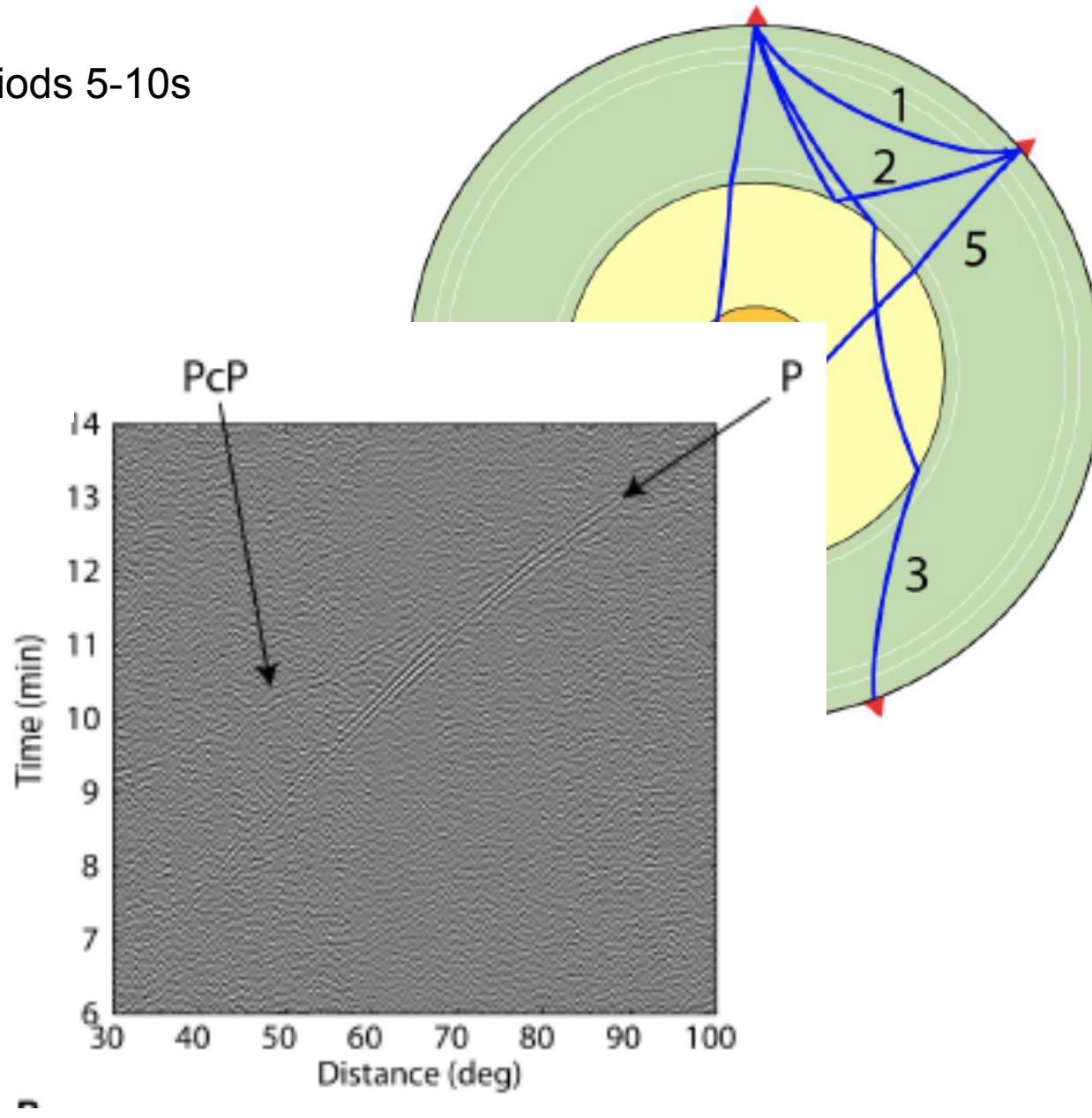


# GLOBAL TELESEISMIC CORRELATIONS (periods 25-100s)



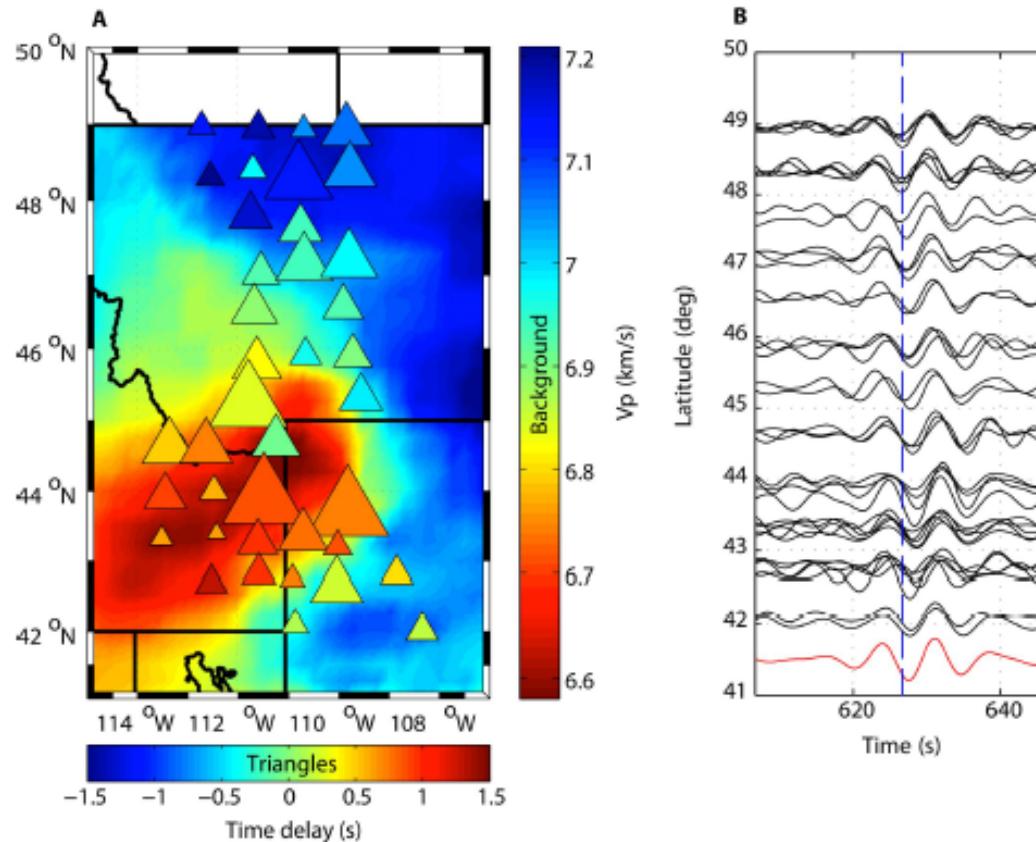


Periods 5-10s

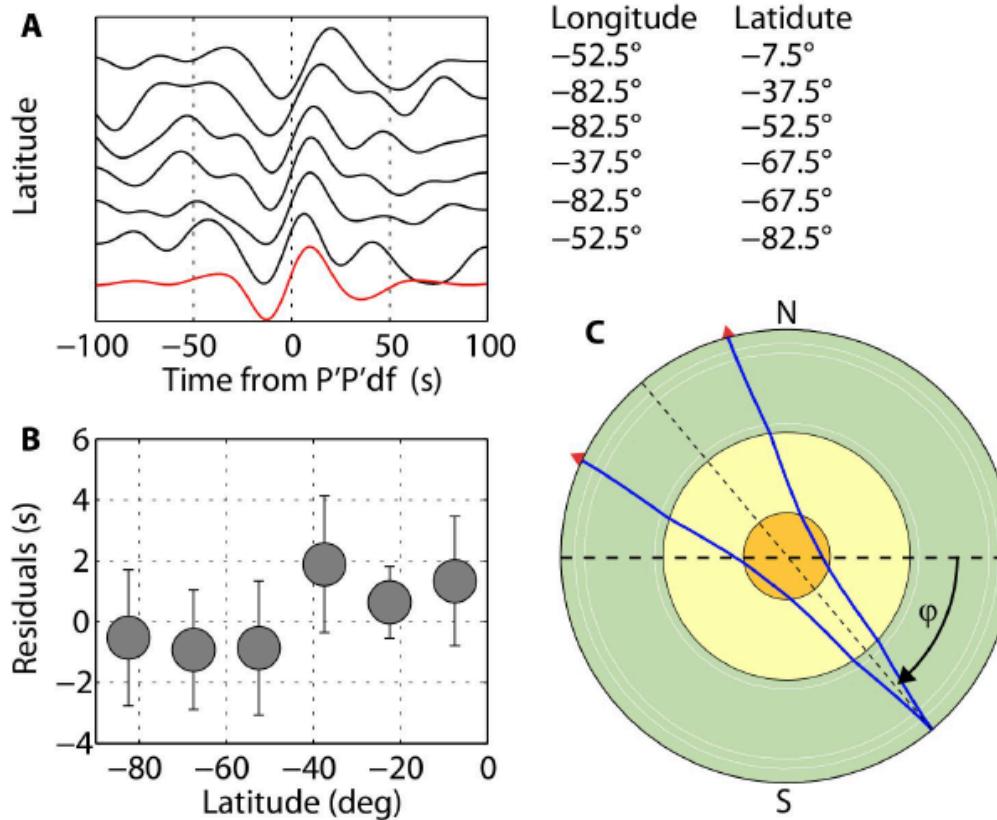


## Application to tomography Yellowstone anomaly

Comparison of teleseismic correlations (Finland-US)  
with tomographic model expectation



## Measure of the anisotropy of the inner core: (polar paths are faster than equatorial paths)



Boué, Poli et al., GJI 2013

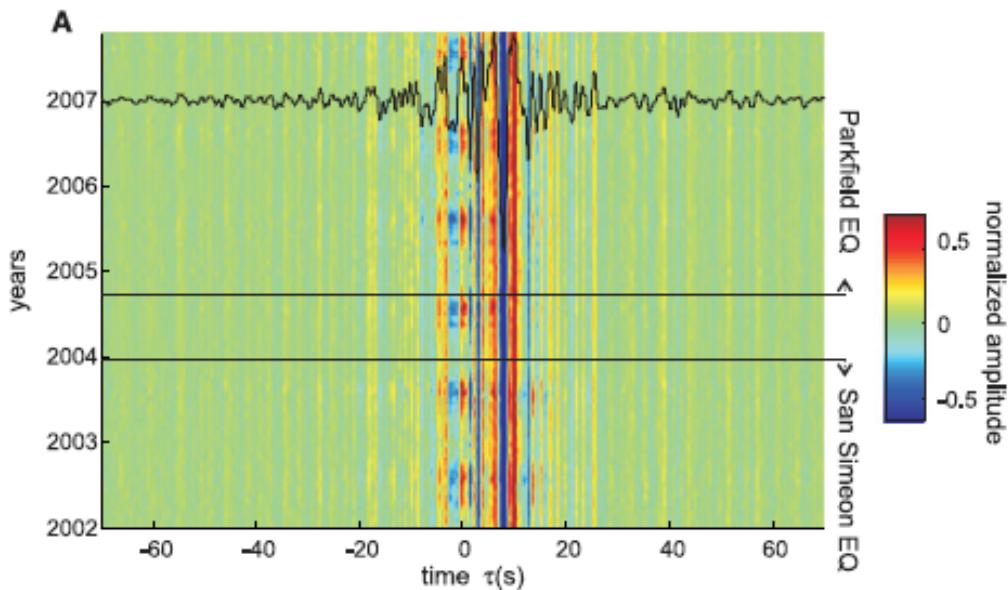
➔ Numerous applications to come!

-Introduction

-Passive imaging

**-Monitoring the changing Earth**

Correlation functions as approximate Green functions  
(ex: period band:2-8s Parkfield, Brenguier et al., 2008)

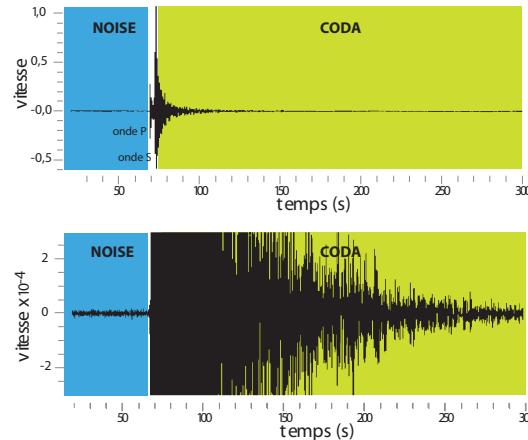


Direct waves are sensitive to noise source distribution (errors small enough for tomography ( $\leq 1\%$ ) but too large for monitoring (goal  $\approx 10^{-4}$ )

Stability of the ‘coda’ of the noise correlations = frozen distribution of scatterers

We can construct virtual seismograms between stations pairs from noise records.

They contain the information about structures, but also all the complexity of actual seismograms

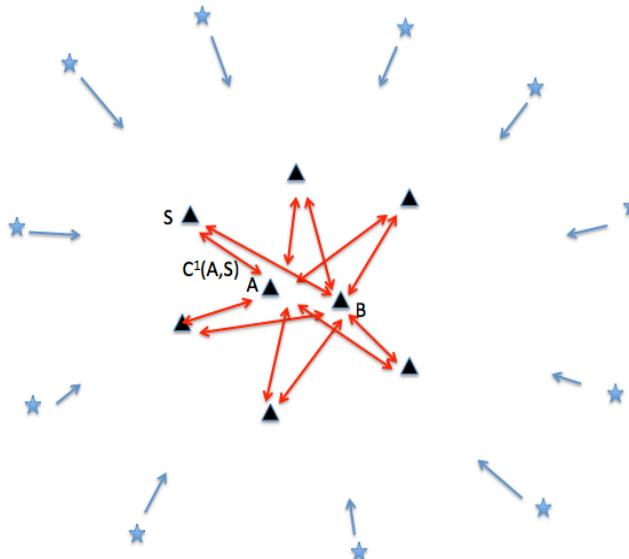


Specifically they contain the scattered waves (coda waves). This is attested by the fact that we can also construct ‘virtual’ seismograms from the correlation of noise based virtual seismograms

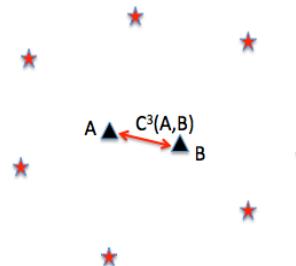
- ➔ C<sup>3</sup> method (*Stehly et al., 2008; Garnier et al., 2011*)
- ➔ can even be iterated in C<sup>5</sup>.. (*Froment et al., 2011*)
- ➔ long travel times = strong sensitivity to changes

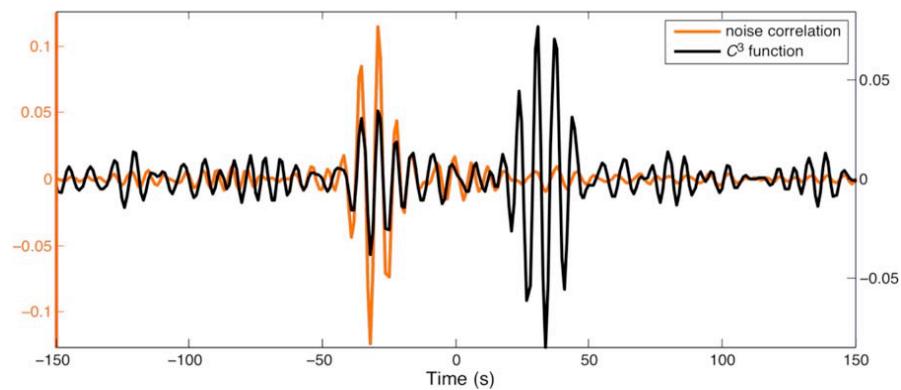
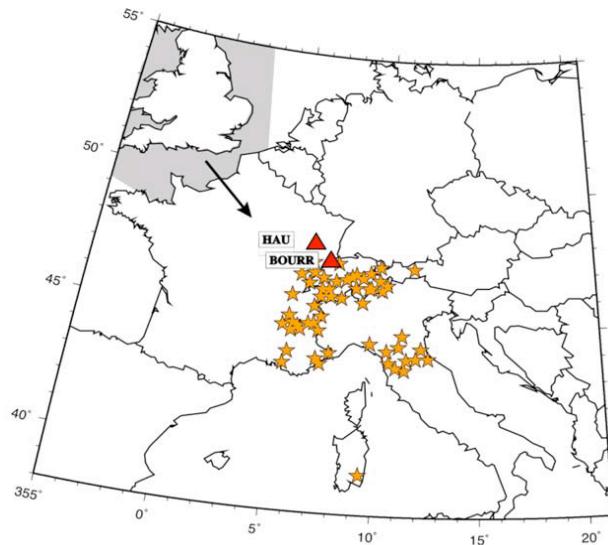
## Illustration of C3

(a) Computation of noise correlations  
(virtual seismograms)



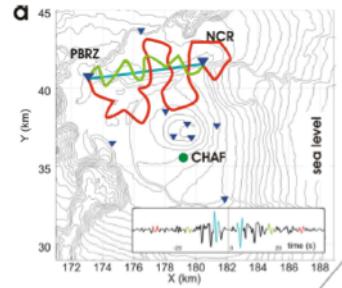
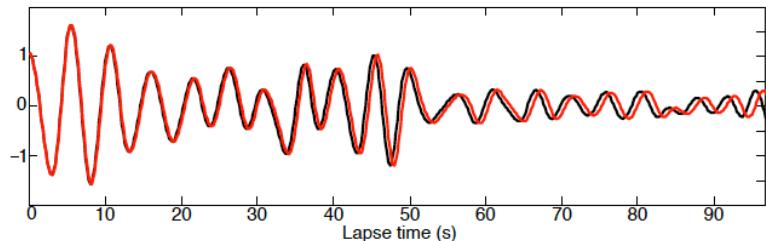
(b) Correlations of noise  
correlation codas (stations as  
virtual sources)



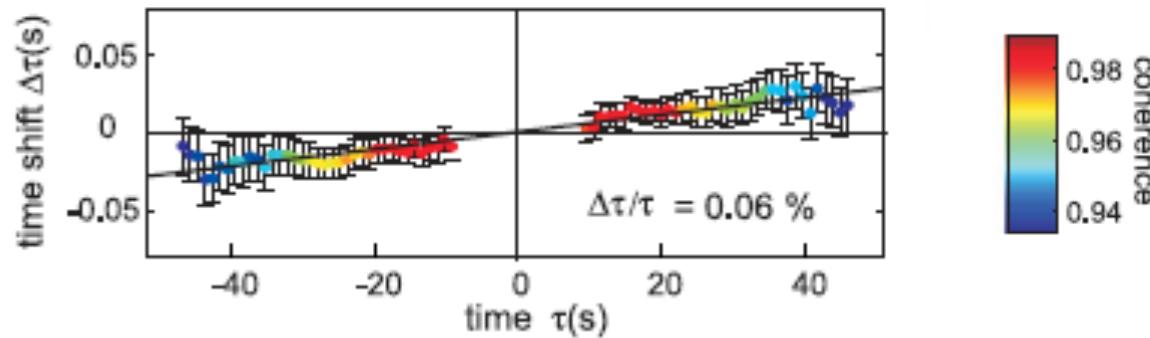


## Detecting a small change of seismic speed: coda waves

Comparing a trace with a reference under the assumption of an homogeneous change

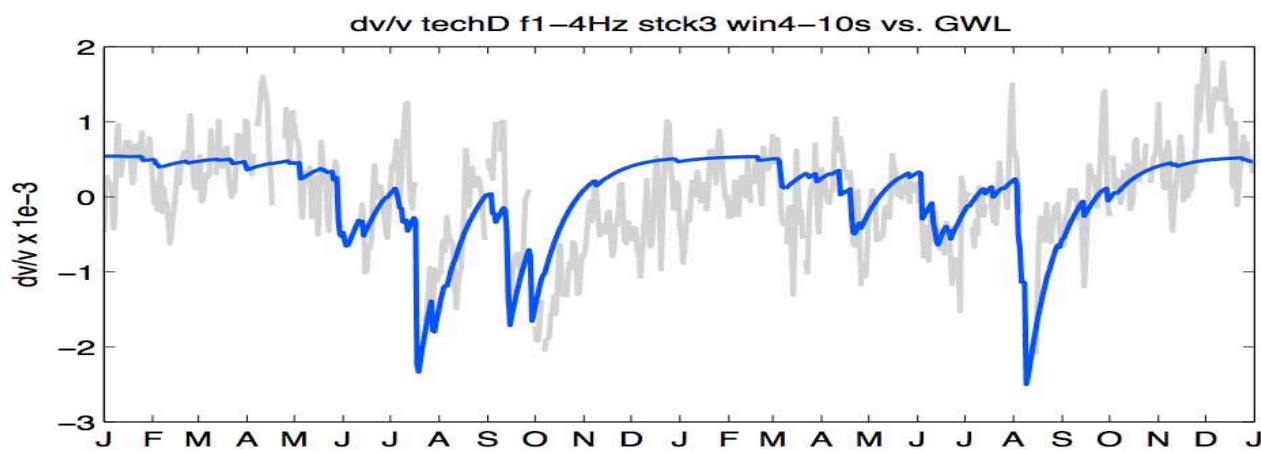
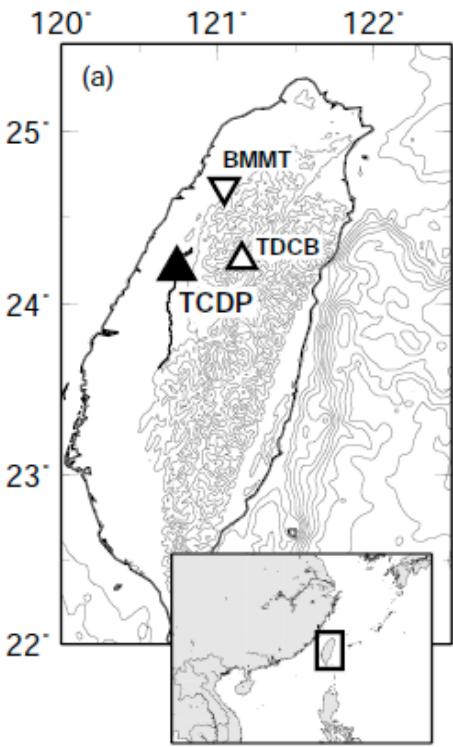


The ‘doublet’ method: moving window cross spectral analysis



Alternative technique: stretching

## Surface effects



grey: variations of seismic speed

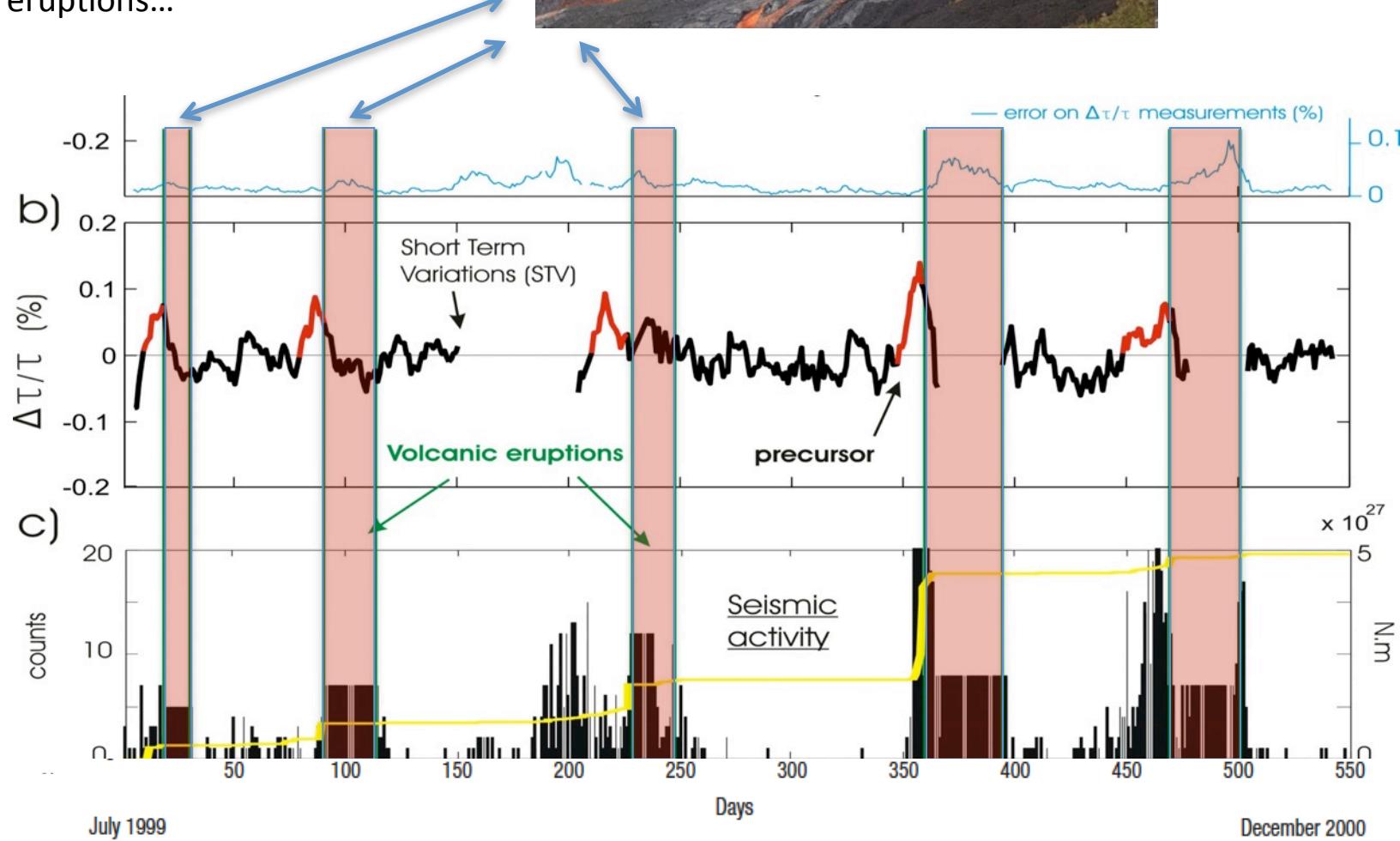
blue: model of the effect to the level of water table deduced from meteorological data

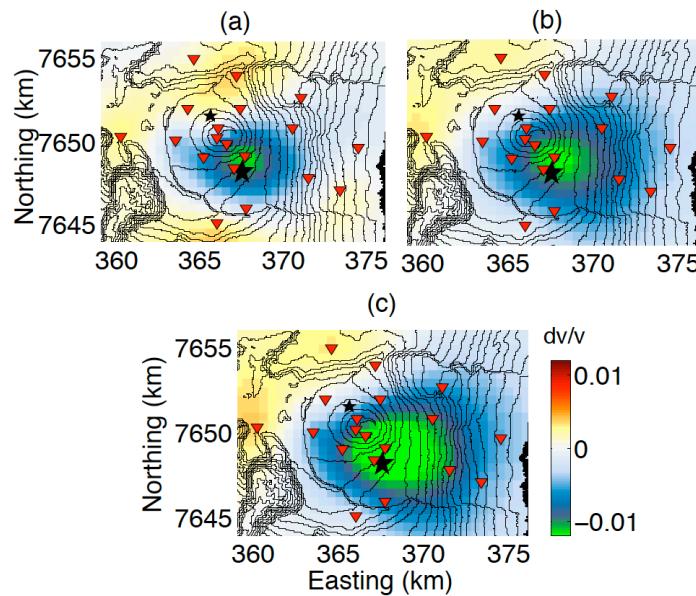


La Réunion



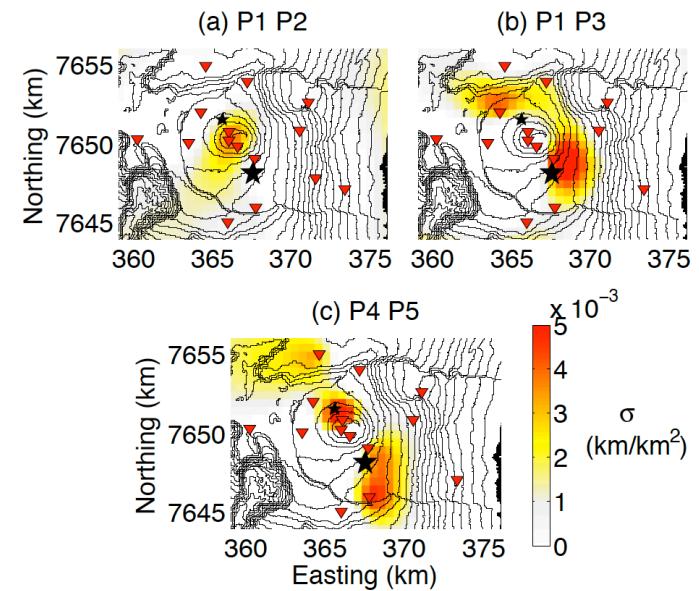
Seismic speed changes before the eruptions...





Local change of speed

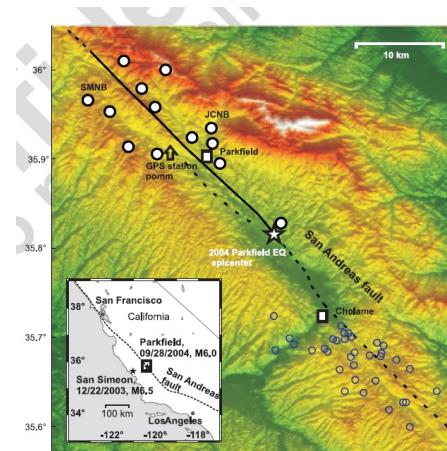
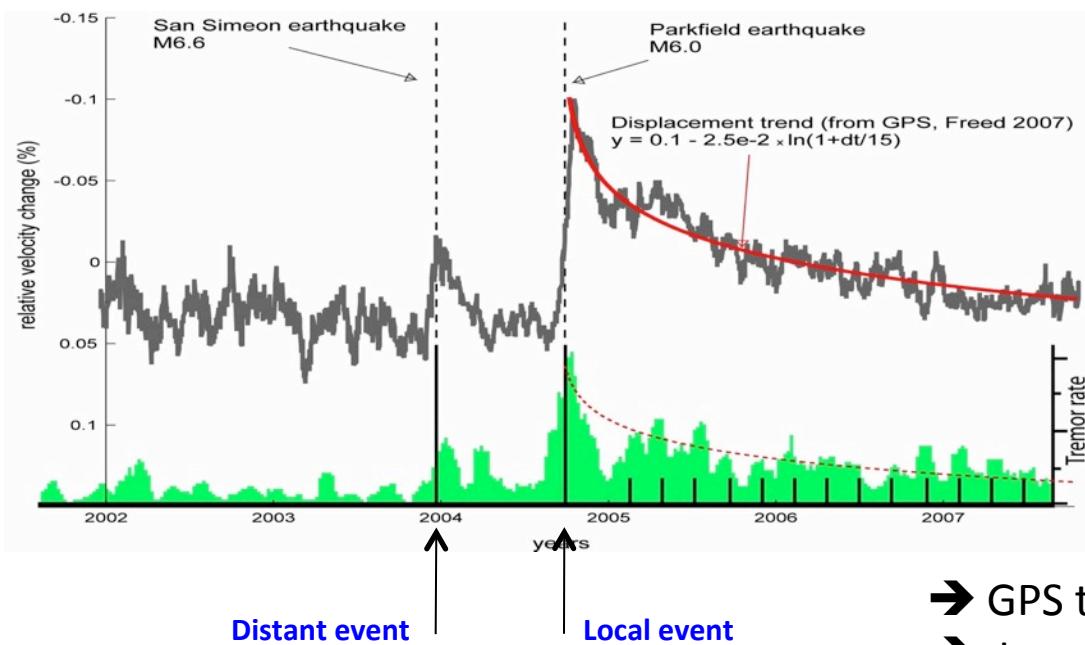
Anne Obermann PhD 2013



Local change of scattering properties

(discussed by E. Larose and F. Brenguier)

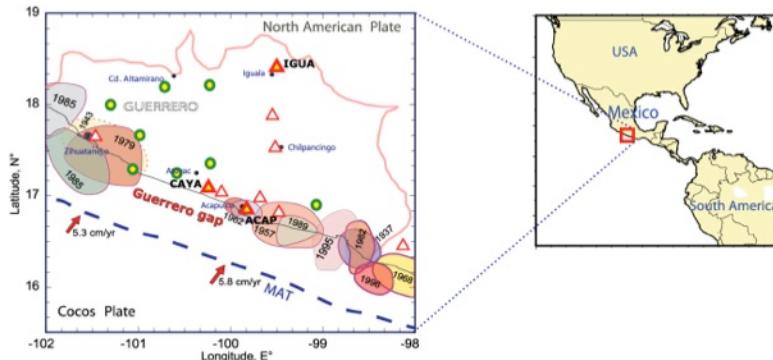
## Application to Parkfield (*Brenguier et al. 2008*) Short period sensors / Processing in the period 1-10s



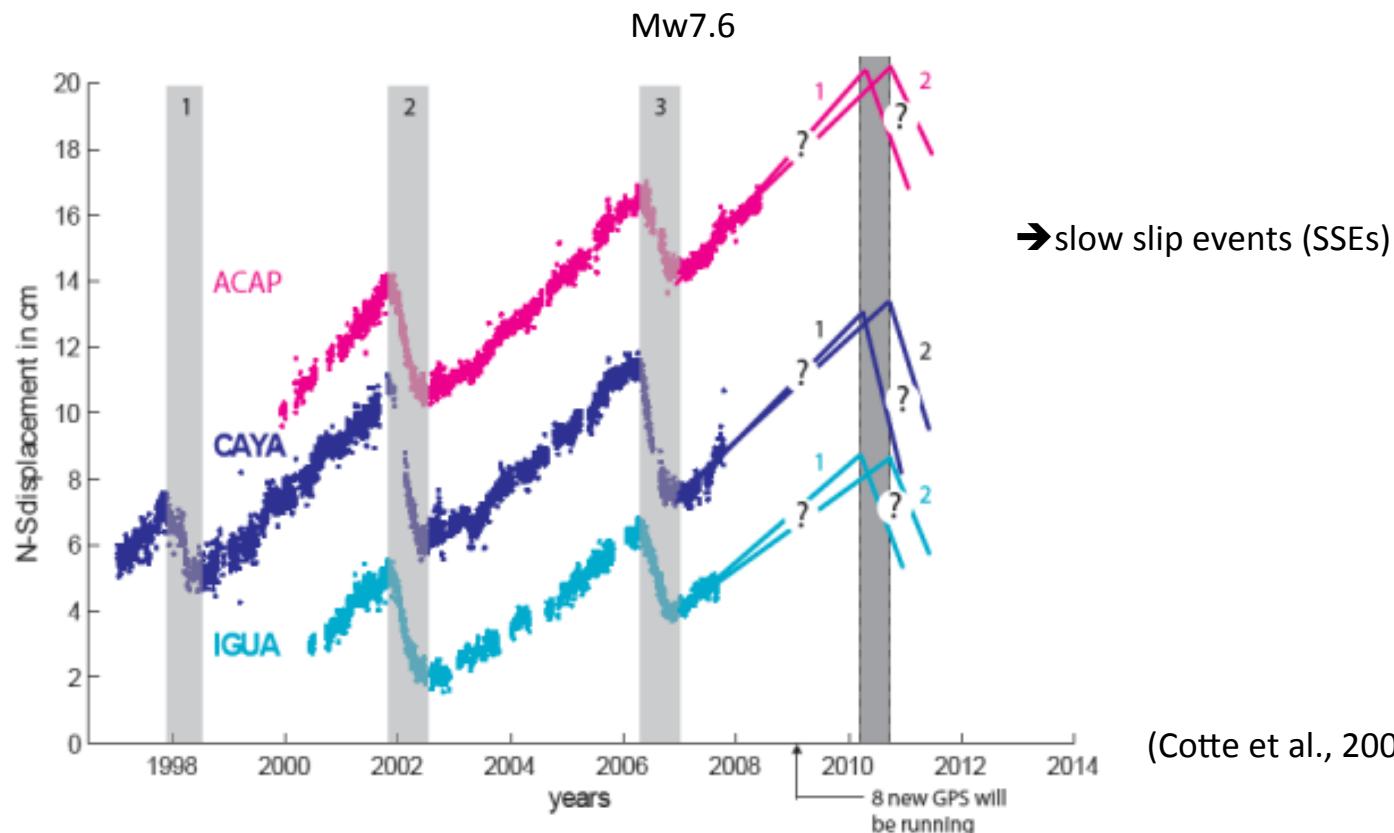
(Talks by P. Johnson and Y. Ben-Zion)

- ➔ GPS trend
- ➔ tremor activity
- ➔ but ambiguity with non-linear effect of strong ground motion on surficial materials

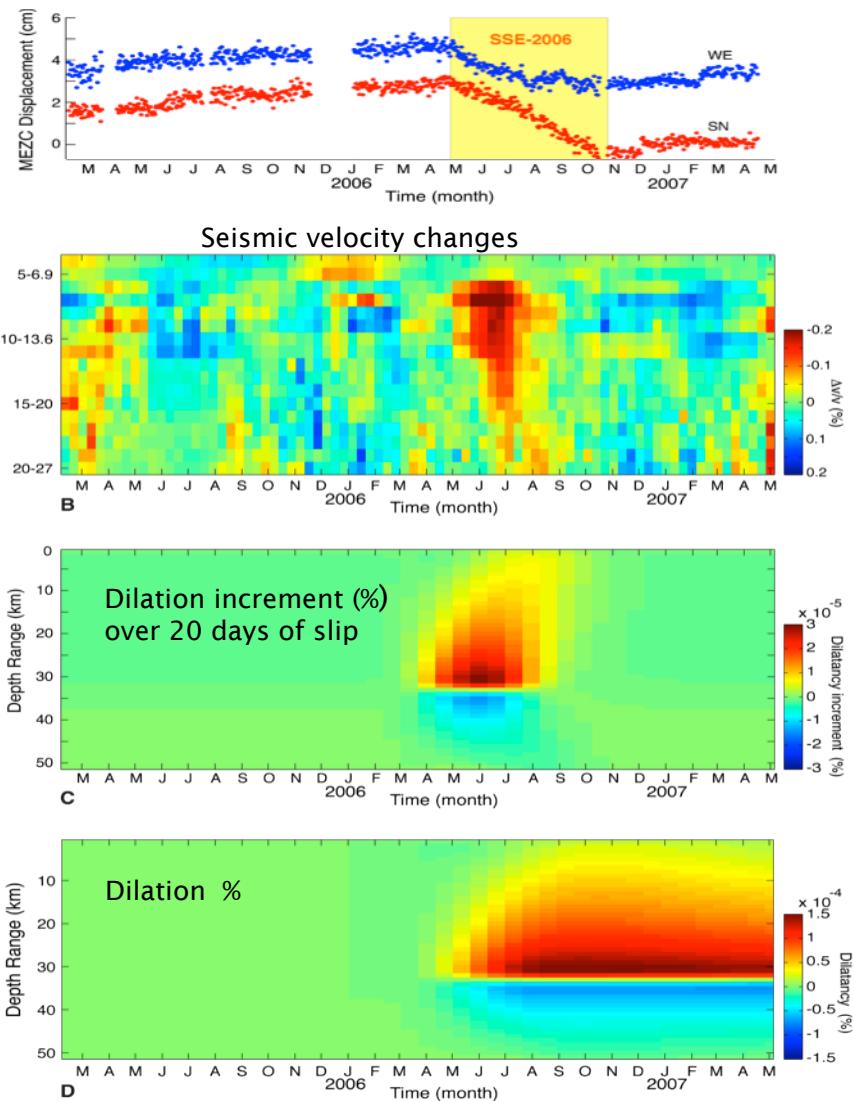
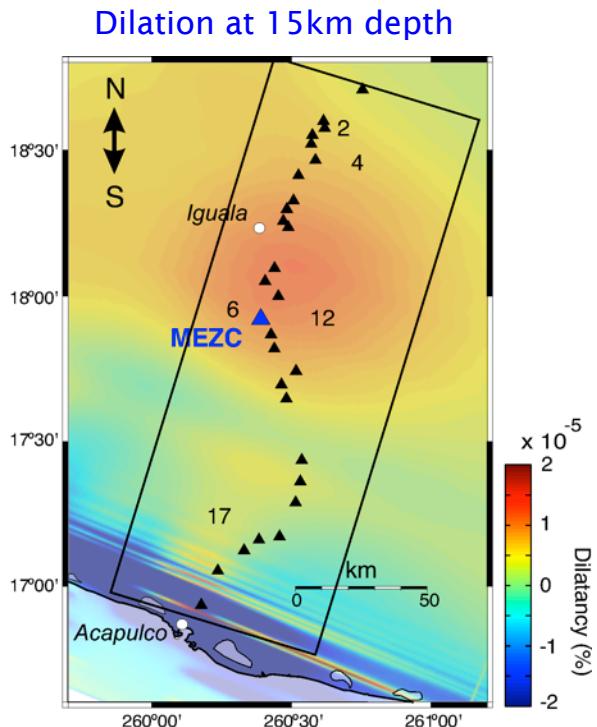
# 'Silent' event of slip on the Subduction plane (40km deep)



GPS motion towards the North during interseismic periods (NO significant events)



# Temporal relation between velocity change and dilatation

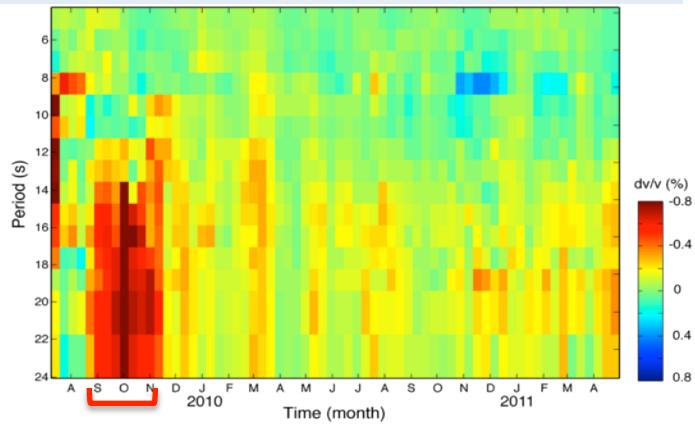


- The minimum of velocity and maximum of dilation rate produced by the SSE occurs in June 2006
- The dilation and the velocity perturbation affect the volume and are not localized at the surface

Rivet et al., 2011

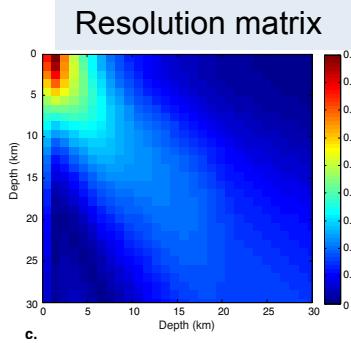
# 2009-2010 Slow Slip Event

Apparent temporal change of velocity ( $t, T$ )



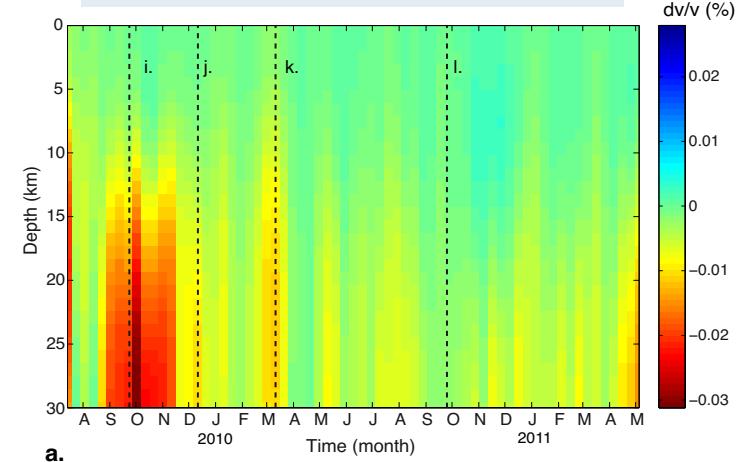
With the period band available, we conclude that the change occurs in the lower crust or below.

Linearized Rayleigh wave inversion



Monte Carlo inversion

Temporal change of velocity ( $t, z$ )



Rivet et al., 2012