

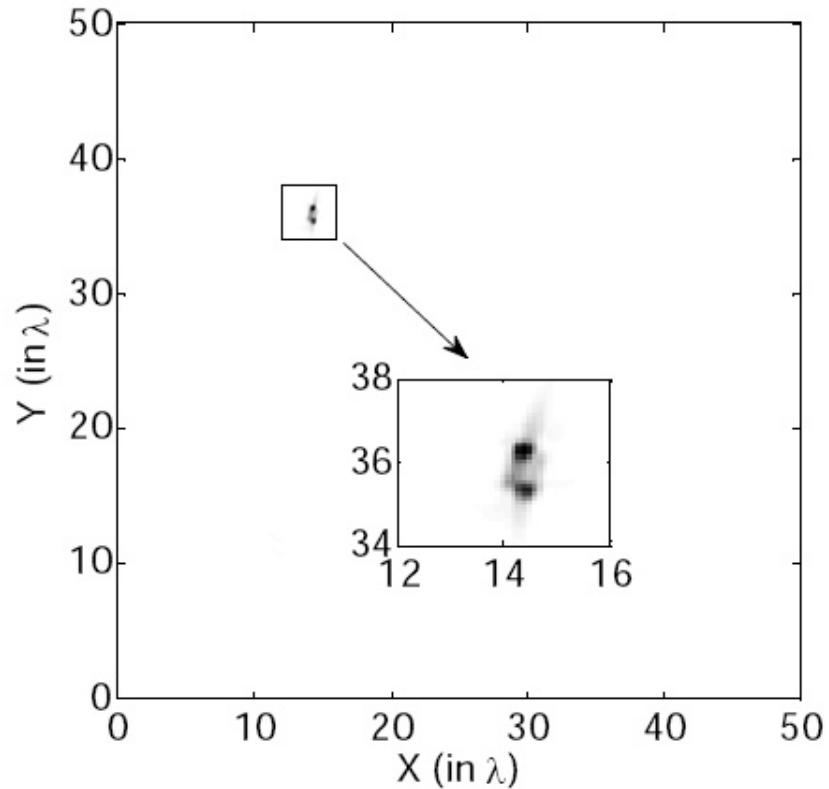
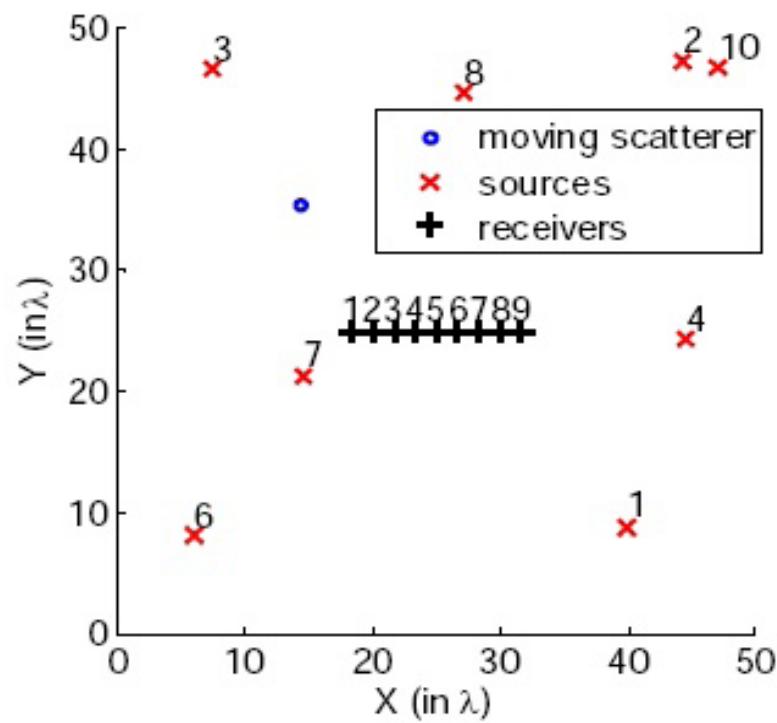
# Locating weak changes in the multiple scattering regime



Thomas PLANES, Eric LAROSE, Vincent ROSSETTO, Ludovic MARGERIN.

# Classical imaging (pulse-echo)

Homogeneous medium  $\Leftrightarrow$  Single scattering regime

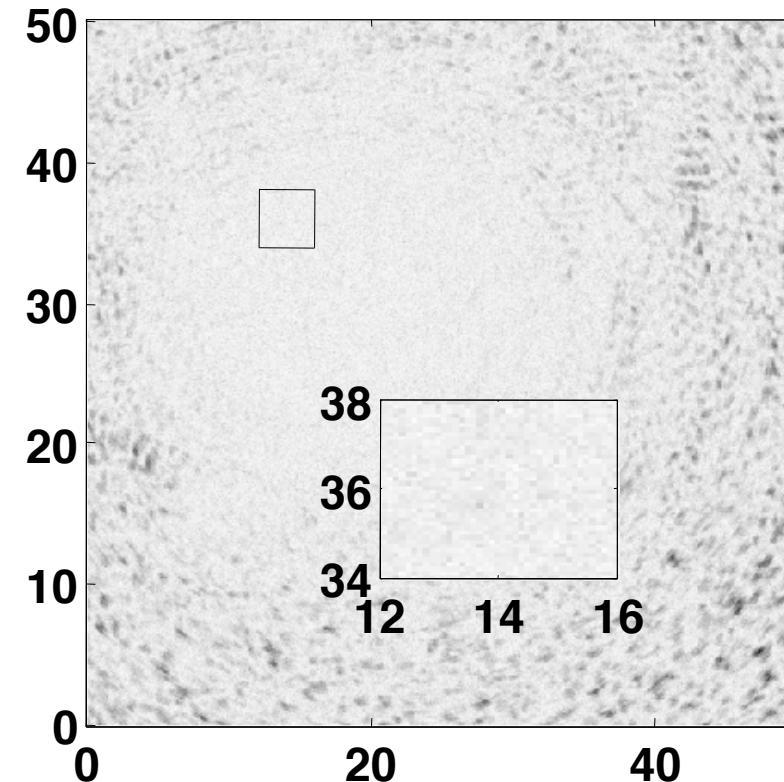
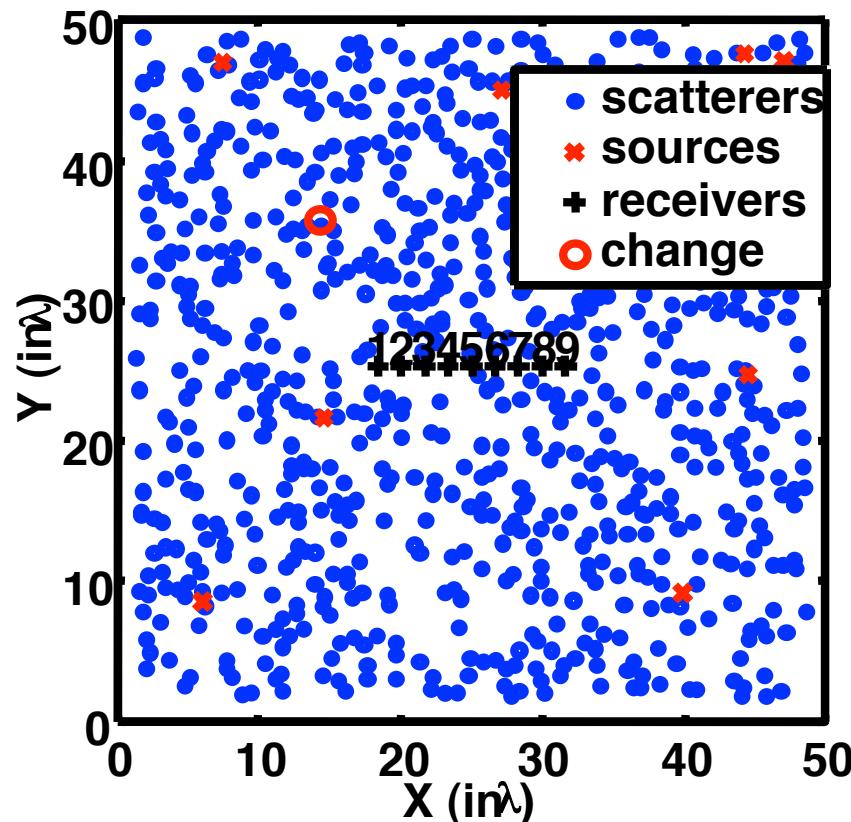


$$I(x, y) = \sum_{S,R} [\phi_0(S, R, \delta) - \phi_1(S, R, \delta)]^2 \quad \delta : \text{Time of flight } S - \text{pixel}(x, y) - R$$

# Classical imaging (pulse-echo)

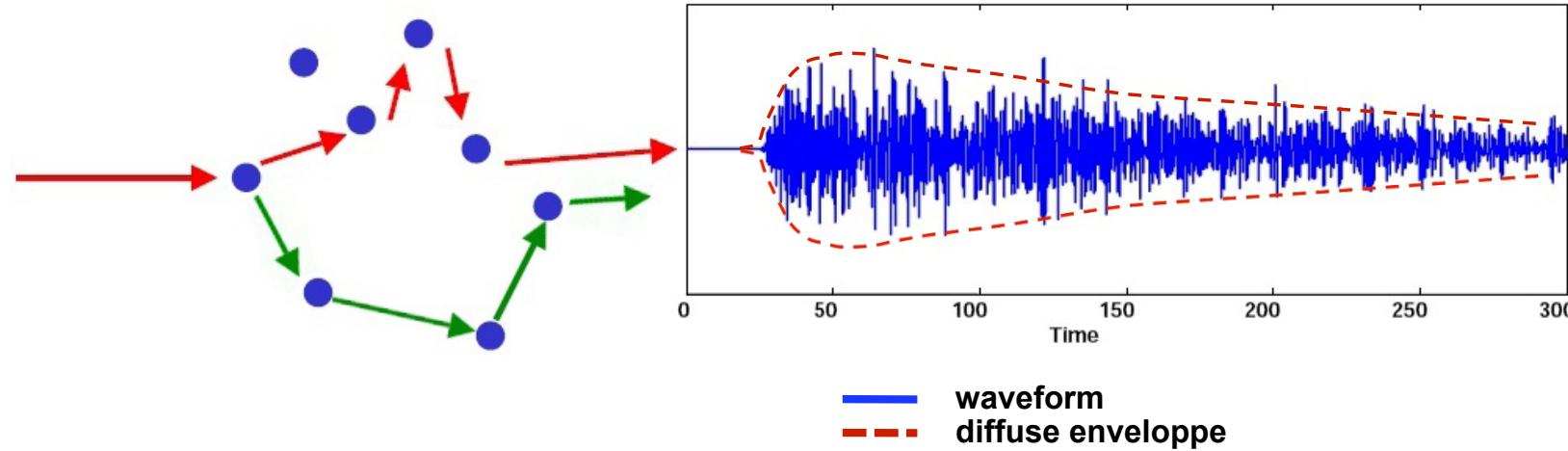
Highly heterogeneous medium  $\Leftrightarrow$  Multiple scattering regime

$$\lambda \ll l^* \ll l_{abs}, L_{medium}$$



$$I(x, y) = \sum_{S, R} [\phi_0(S, R, \delta) - \phi_1(S, R, \delta)]^2 \quad \delta : \text{Time of flight } S - \text{pixel}(x, y) - R$$

# Locating with the coda

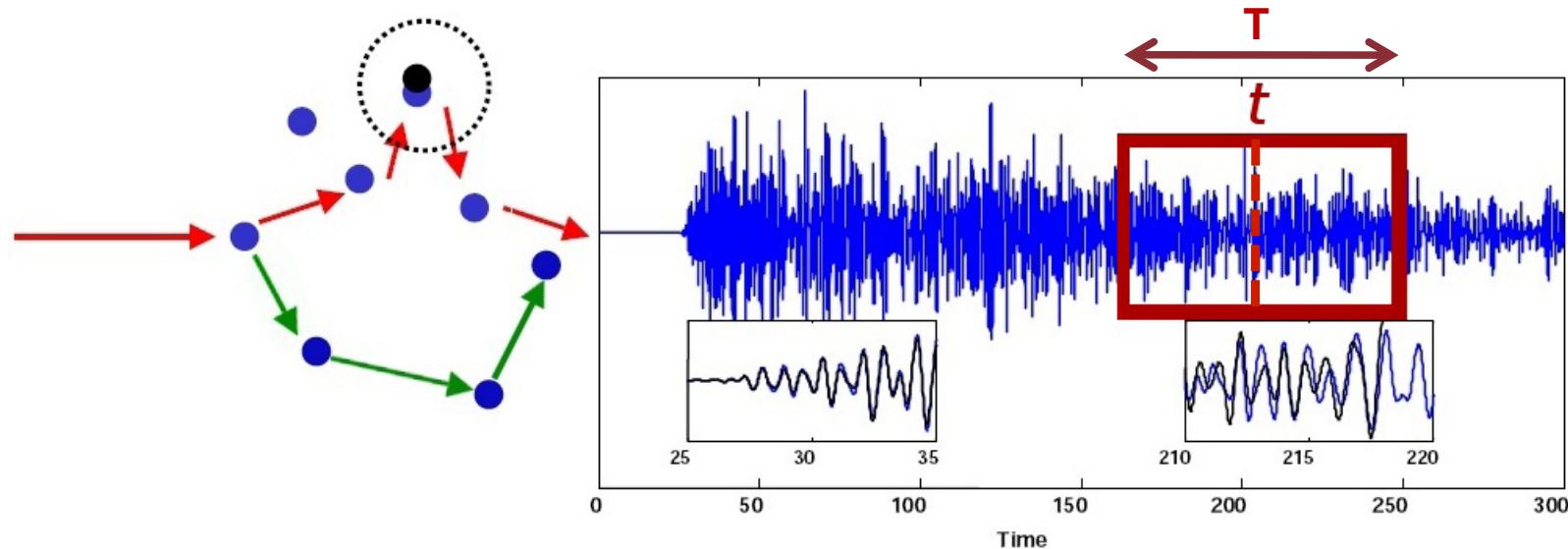


- Complex signal (one arrival time  $\Leftrightarrow$  several trajectories)
- Diffuse intensity

➡ **Statistical approach**

- Intensity correlation [Feng & Sornette 1991]
- Time-lapse travel time change [Pacheco & Snieder 2005]
- D(A)WS...[Pine et al. 1988, Cowan et al. 2002]

# Signature of a change in the coda

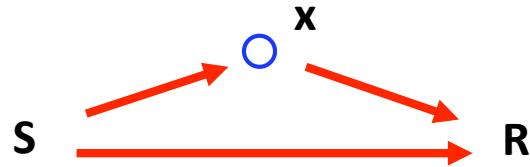


**Very sensitive to weak changes**

Decorrelation :  $DC(t) = 1 - \frac{\langle \phi_0(t) \cdot \phi_1(t) \rangle_T}{\sqrt{\langle \phi_0(t)^2 \rangle_T \langle \phi_1(t)^2 \rangle_T}}$

Stretching factor :  $\epsilon(t) = \epsilon$  that maximises  $\langle \phi_0(t) \cdot \phi_1(t(1 - \epsilon)) \rangle_T$

# Decorrelation induced by an extra scatterer : Theoretical model



Role of an extra scatterer : Nieuwenhuizen & Van Rossum [1993]

## Theoretical decorrelation

$$DC^{th}(S, R, r, t) = \frac{c\sigma}{2} \frac{\int_0^t I(S, r, u)I(r, R, t-u)du}{I(S, R, t)}$$

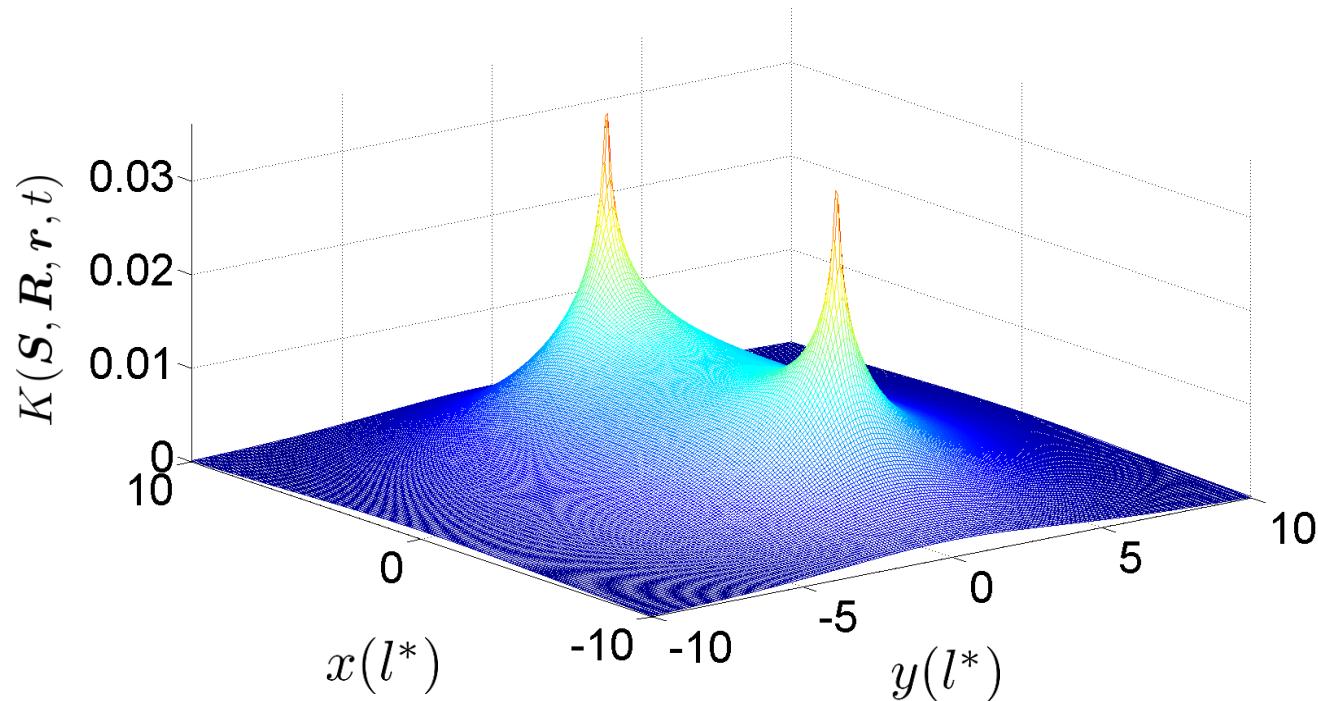
Rossetto et al. [JAP 2011]

$I$  : Intensity propagator (Diffusion solution, Radiative Transfer)  
 $\sigma$  : Scattering cross section of the new defect

# Sensitivity kernel

**decorrelation**

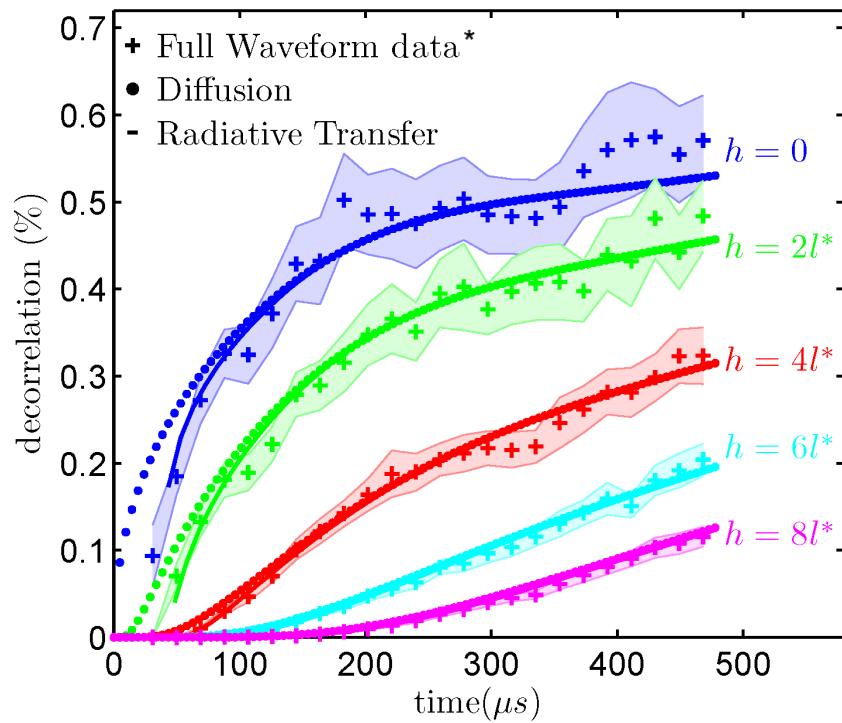
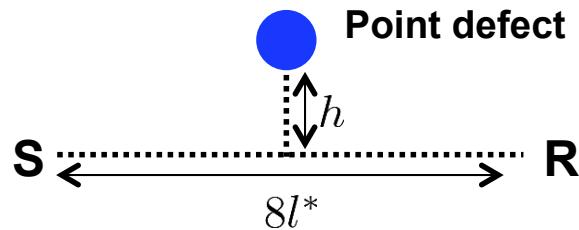
$$DC^{th}(\mathbf{S}, \mathbf{R}, \mathbf{r}, t) = \frac{c\sigma}{2} K(\mathbf{S}, \mathbf{R}, \mathbf{r}, t)$$
$$K(\mathbf{S}, \mathbf{R}, \mathbf{r}, t) = \frac{\int_0^t I(\mathbf{S}, \mathbf{r}, u) I(\mathbf{r}, \mathbf{R}, t-u) du}{I(\mathbf{S}, \mathbf{R}, t)}$$



$I(\mathbf{S}, \mathbf{R}, t)$  = Diffusion solution

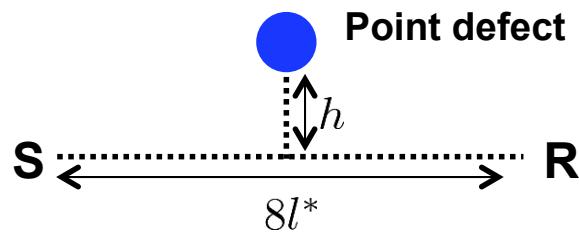
# Forward problem validation

Far field

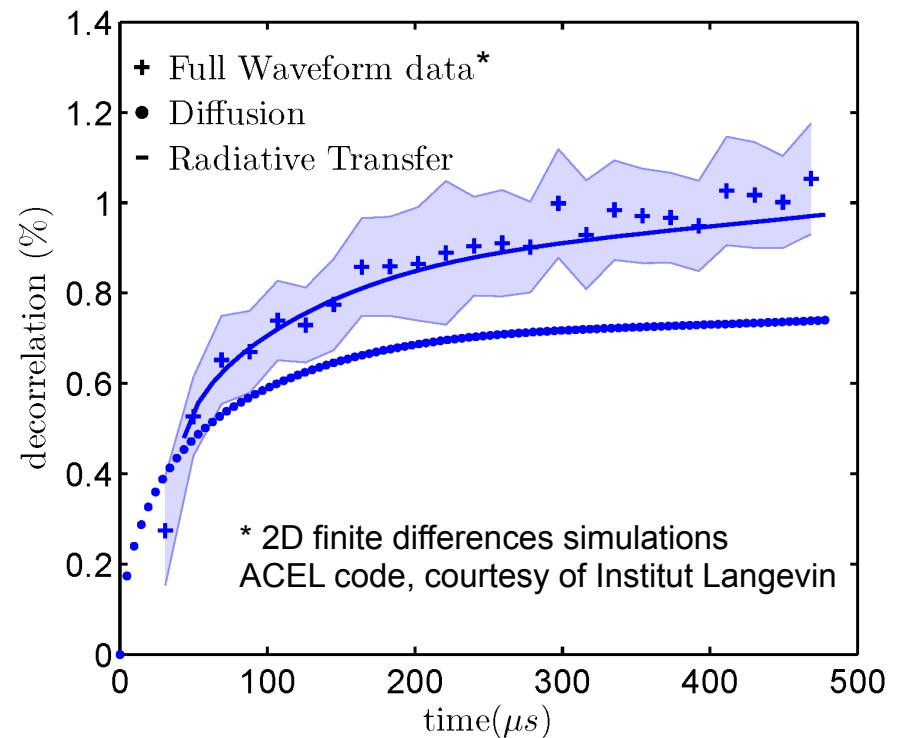
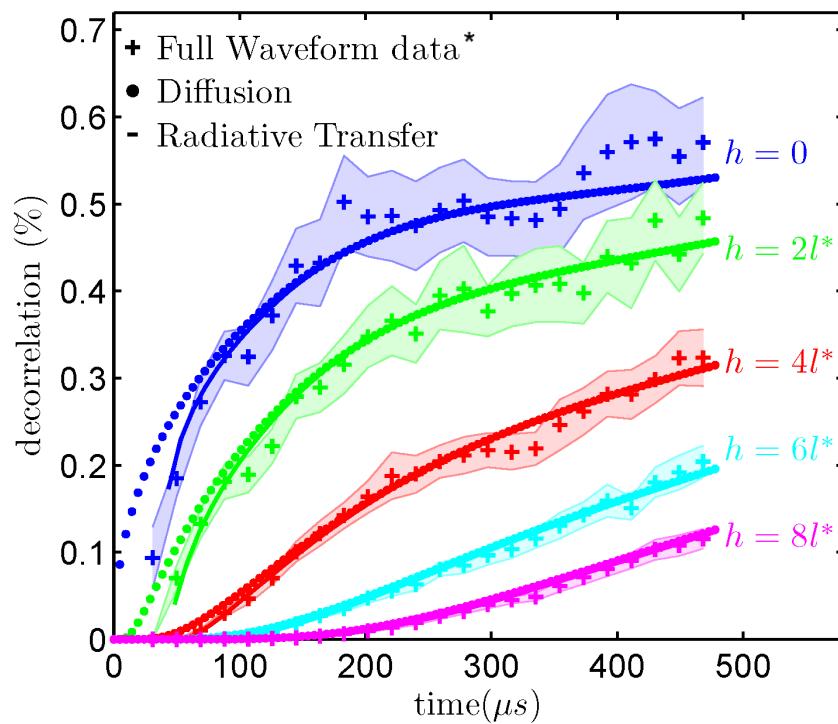
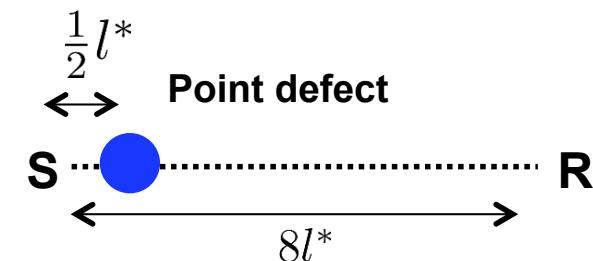


# Forward problem validation

Far field



Near field



# Forward problem validation

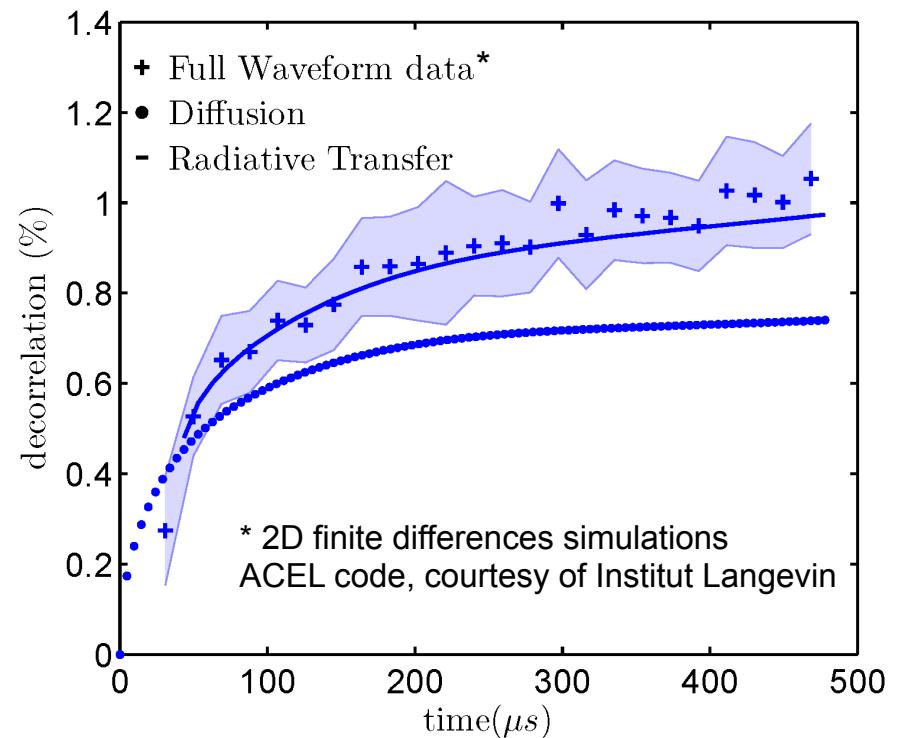
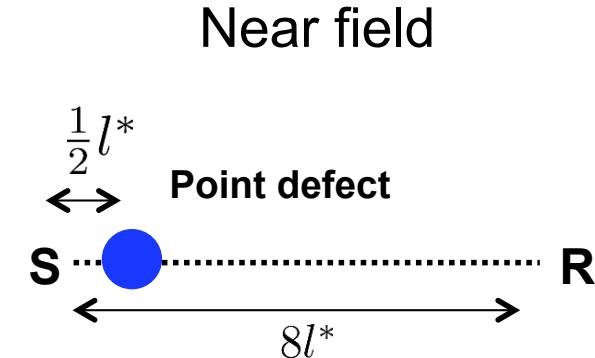
2D Radiative Transfer Solution  
[Paasschens PRE 1997] :

$$I(\mathbf{r}, t) = \frac{e^{-ct/l}}{2\pi r} \delta(ct - r)$$

cohérent

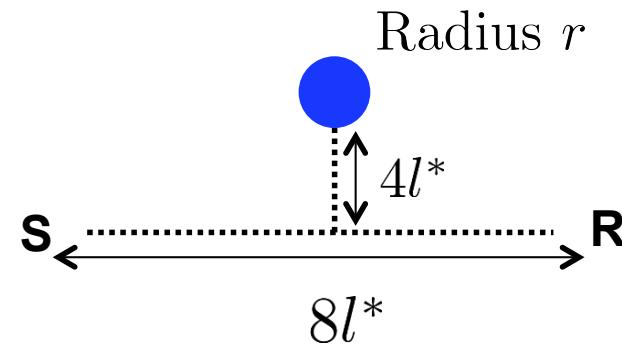
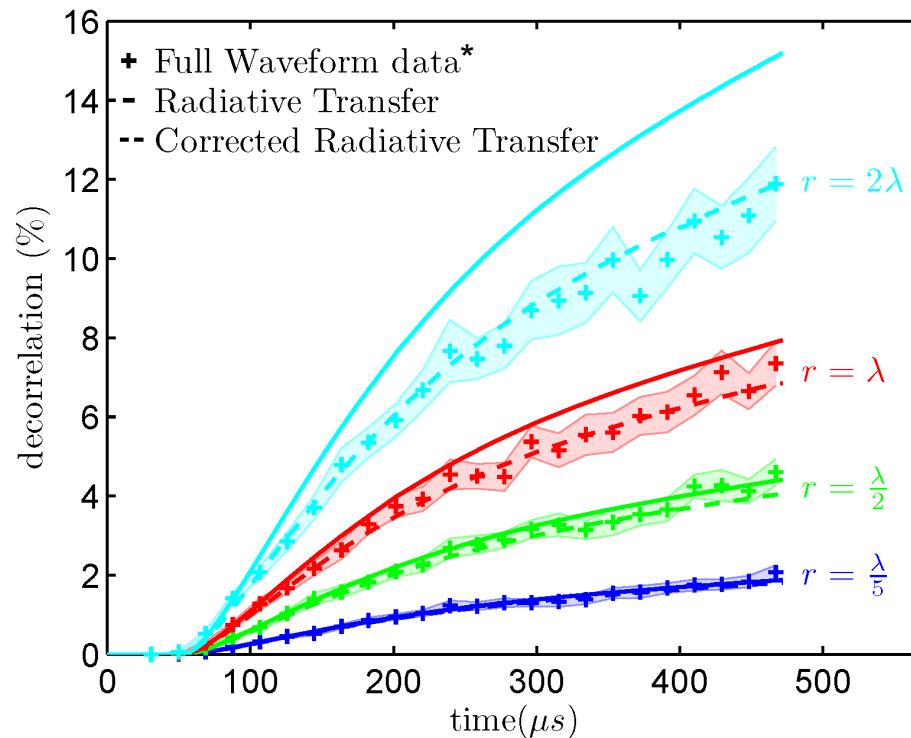
$$+ \frac{1}{2\pi l c t} \left(1 - \frac{r^2}{c^2 t^2}\right)^{-\frac{1}{2}} e^{[l^{-1}(\sqrt{c^2 t^2 - r^2} - ct)]} \Theta(ct - r)$$

incohérent



# Forward problem validation

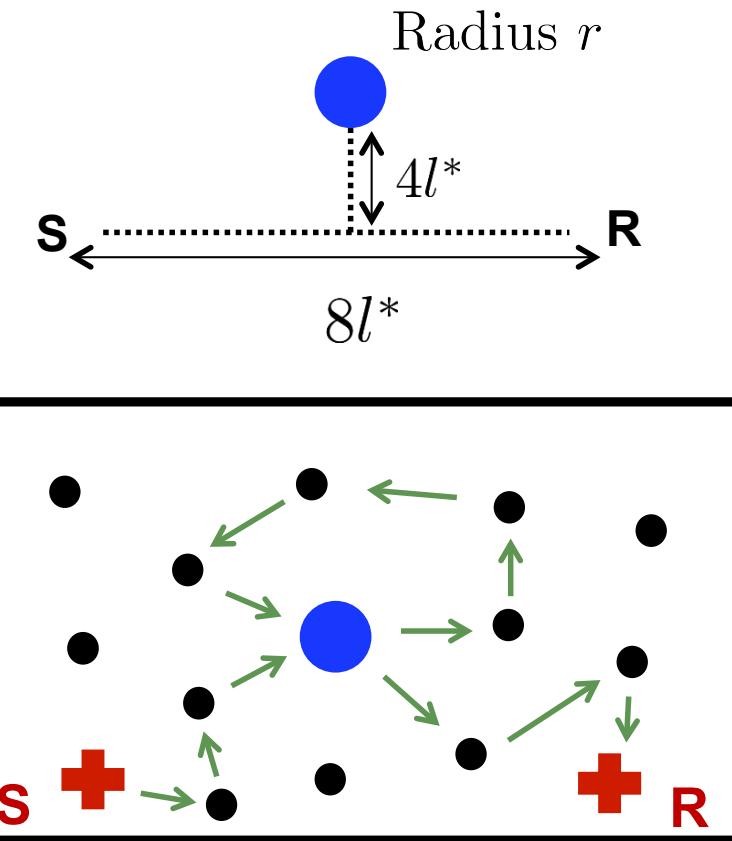
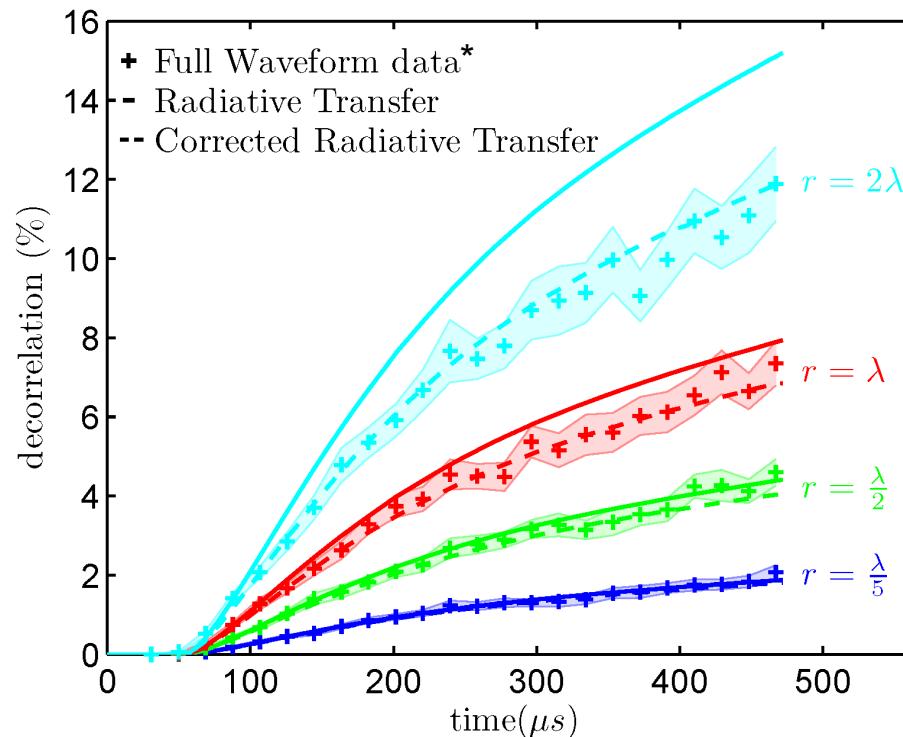
## Size of the defect



\* 2D finite differences simulations  
ACEL code, courtesy of Institut Langevin

# Forward problem validation

## Size of the defect



\* 2D finite differences simulations  
ACEL code, courtesy of Institut Langevin

**Loops contribution**

# Inversion process

First approach : locating one local change

Experiment:

$$\phi_0^{ij}(S_i, R_j, t) \quad \phi_1^{ij}(S_i, R_j, t)$$

→  $DC_{ij}^{exp}(S_i, R_j, t)$

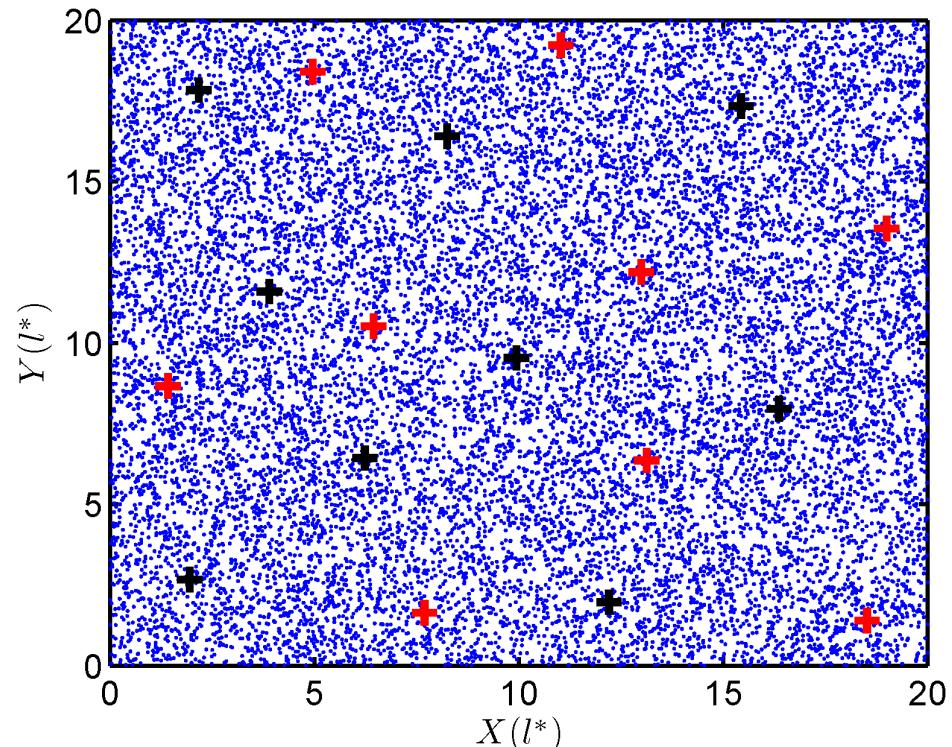
Experimental decorrelations

Numerical model :

For each pixel  $r$  :

→  $DC_{ij}^{th}(S_i, R_j, r, t)$

Theoretical decorrelation



$(r, \sigma)$  that minimizes the misfit ?

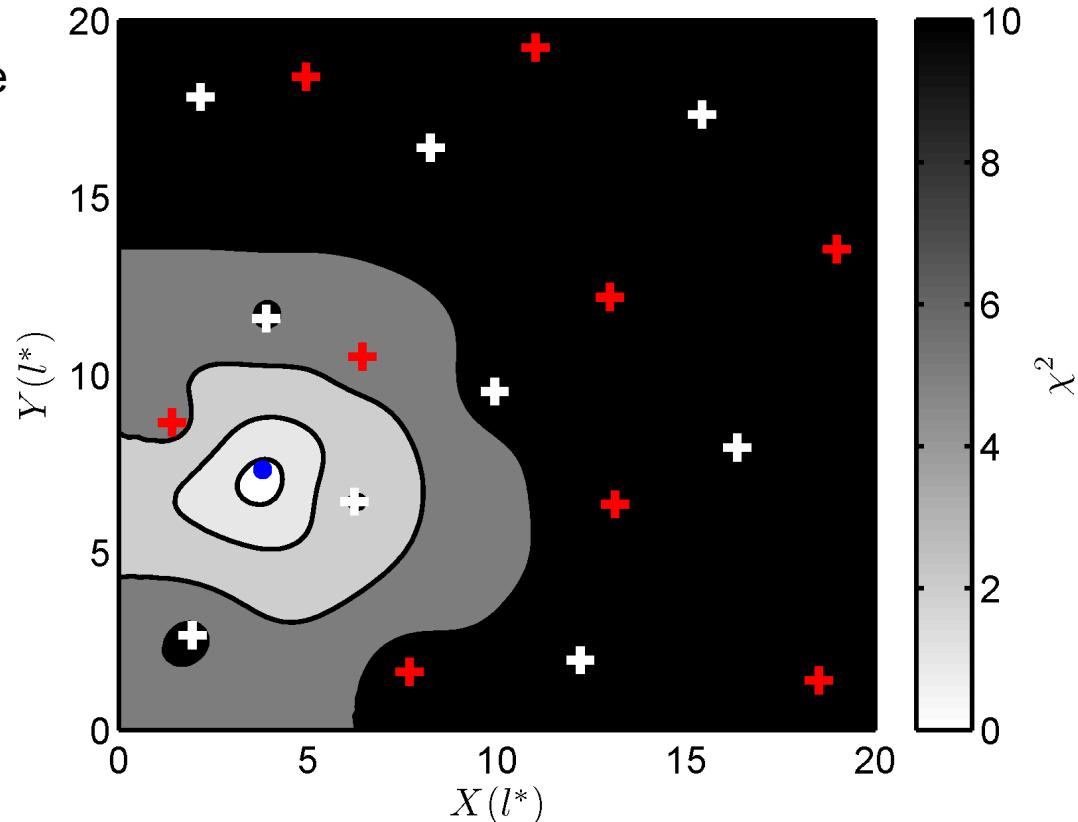
# Inversion process

First approach : locating one local change

- 2D Acoustic Finite-Difference Simulation
- Reflective Boundaries

- Sources
- Receivers
- New defect :

Point Defect



$$\text{Misfit function map : } \chi^2(\mathbf{r}) = \frac{1}{N\epsilon^2} \sum_{ij} (DC_{ij}^{exp} - DC_{ij}^{th})^2$$

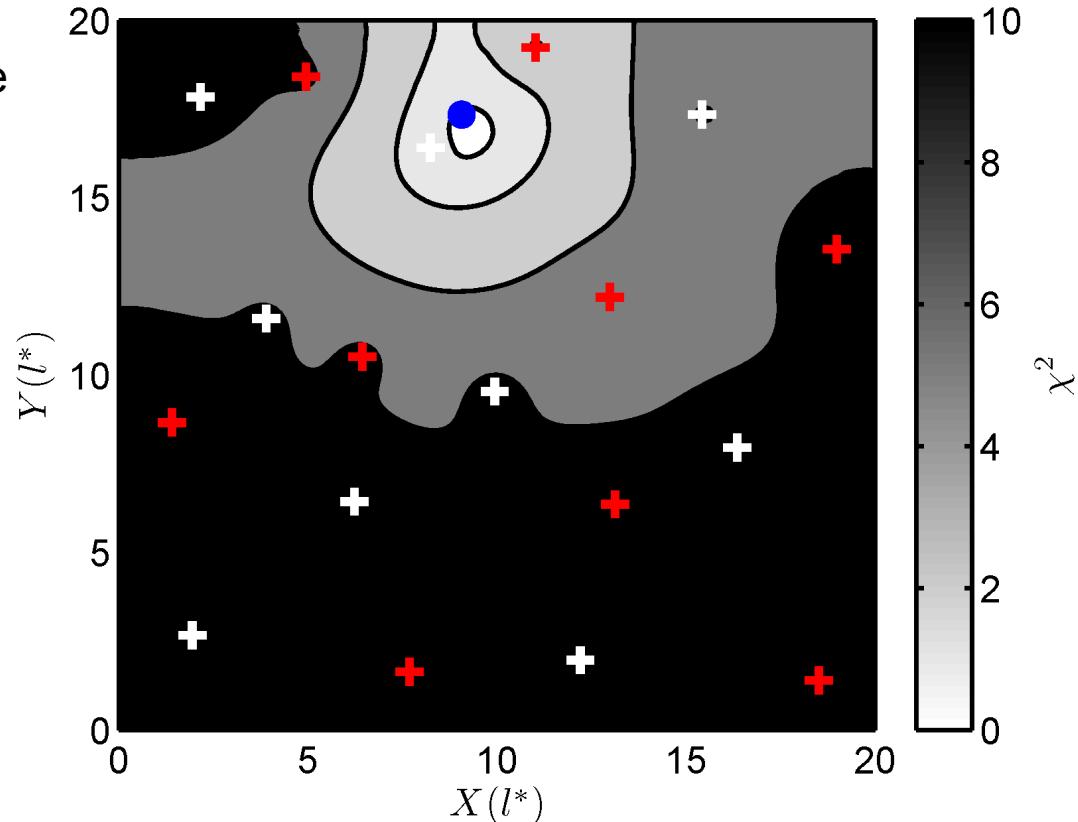
# Inversion process

First approach : locating one local change

- 2D Acoustic Finite-Difference Simulation
- Reflective Boundaries

- Sources
- Receivers
- New defect :

$$\text{Radius} = \frac{\lambda}{4}$$



Misfit function map :  $\chi^2(\mathbf{r}) = \frac{1}{N\epsilon^2} \sum_{ij} (DC_{ij}^{exp} - DC_{ij}^{th})^2$

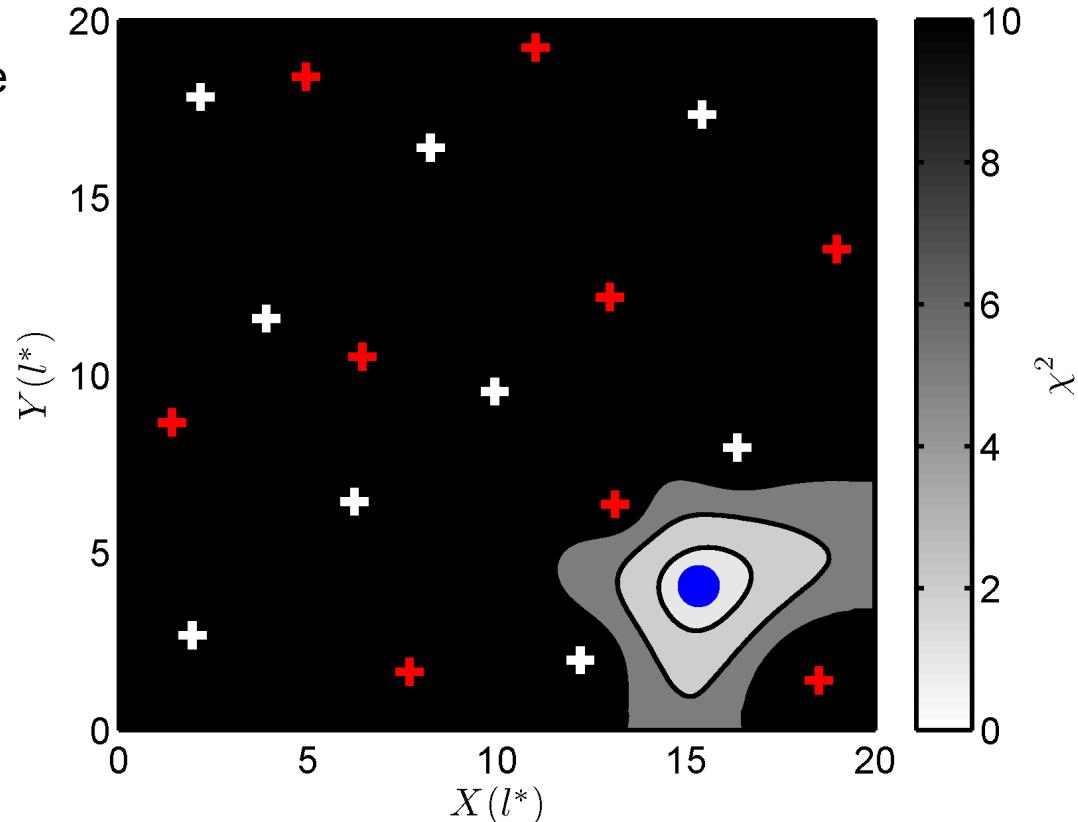
# Inversion process

First approach : locating one local change

- 2D Acoustic Finite-Difference Simulation
- Reflective Boundaries

-  Sources
-  Receivers
-  New defect :

$$\text{Radius} = \frac{\lambda}{2}$$



Misfit function map :  $\chi^2(\mathbf{r}) = \frac{1}{N\epsilon^2} \sum_{ij} (DC_{ij}^{exp} - DC_{ij}^{th})^2$

# Inversion process

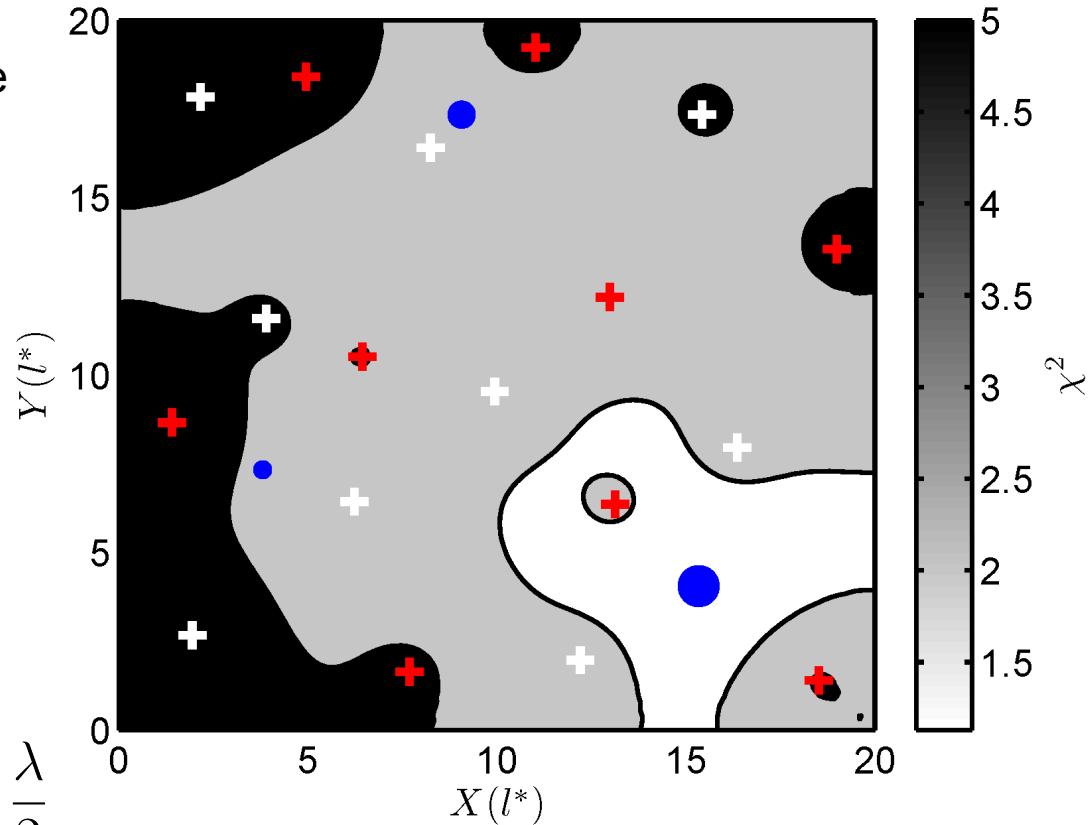
First approach : locating one local change

- 2D Acoustic Finite-Difference Simulation
- Reflective Boundaries

-  Sources
-  Receivers
-  New defect :

Point Defect,

$$\text{Radius} = \frac{\lambda}{4}, \text{Radius} = \frac{\lambda}{2}$$



Misfit function map :  $\chi^2(\mathbf{r}) = \frac{1}{N\epsilon^2} \sum_{ij} (DC_{ij}^{exp} - DC_{ij}^{th})^2$

# Inversion process

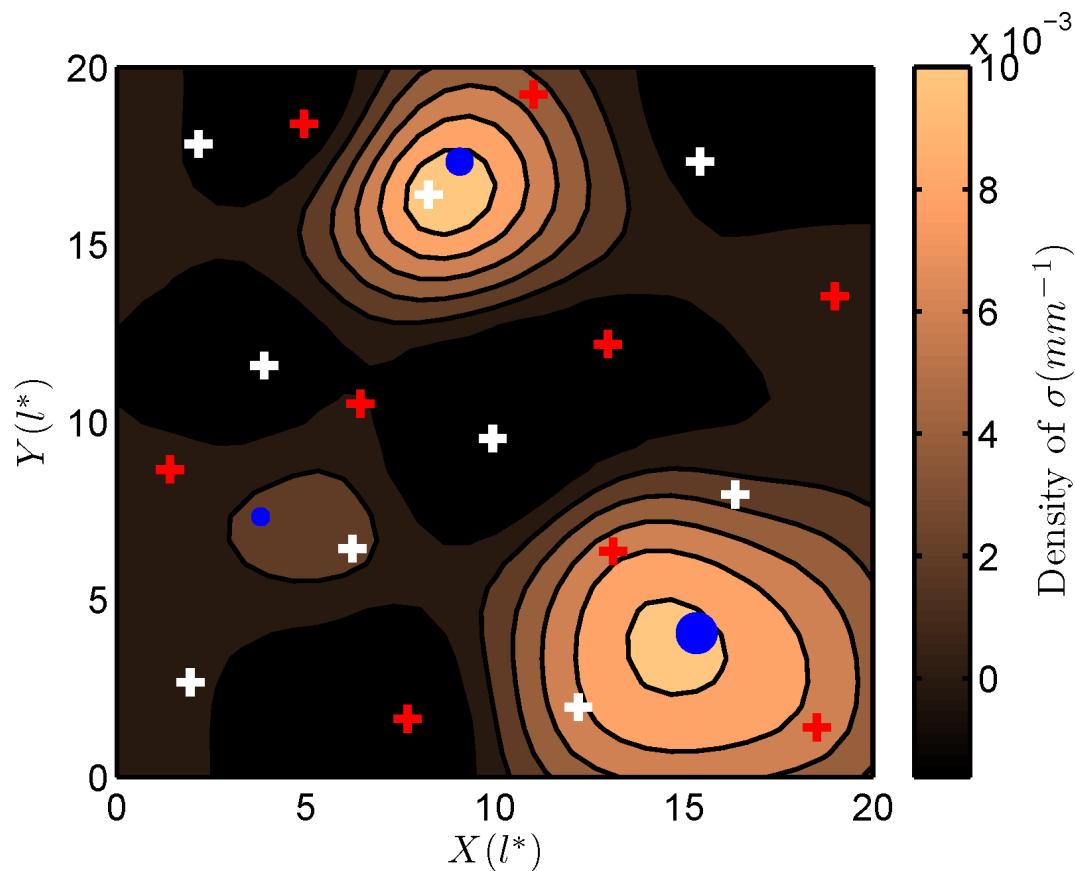
Locating several changes

Linear forward problem :

$$DC = \frac{c}{2} K \sigma$$

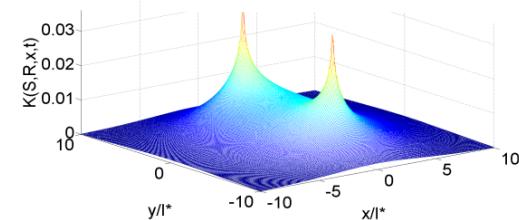
Least square inversion  
[Tarantola 2005] :

$$\xrightarrow{\text{orange arrow}} \tilde{\sigma}$$



## Applications :

- Same sensitivity kernel, different measures (extra scatterer, velocity change)
- Non destructive testing in civil engineering
- Monitoring in geophysics (active faults, volcanoes)



## Outlook :

- Imaging of extended or multiple defects
- Characterizing the change (fluid ?, absorbing ?, geometry ?)

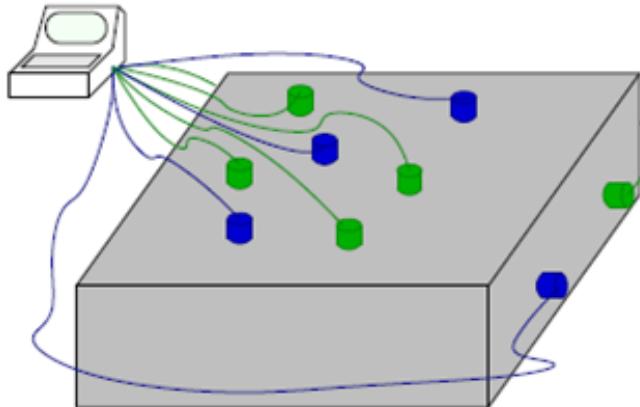


## Publications :

- Larose et al., Appl. Phys. Lett. 96, 204101 (2010)
- Rossetto et. al., J. Appl. Phys. 109, 034903 (2011)
- Patent No. FR09-50612

# Inversion process

First approach : locating one local change

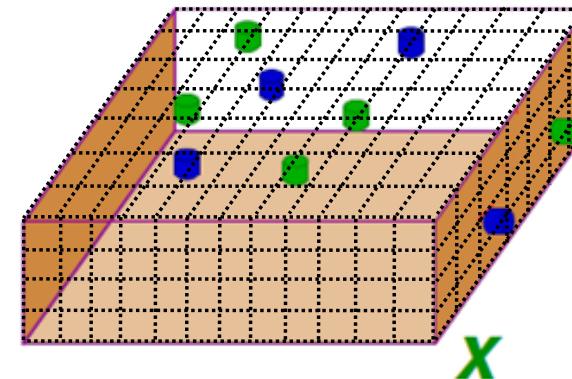


Experiment :

$$\varphi_0^{ij}(S_i, R_j, t) \quad \varphi_1^{ij}(S_i, R_j, t)$$

$$\rightarrow Q_{ij}^{\text{exp}}(S_i, R_j, t)$$

**Experimental decorrelations**



Numerical model :

For each voxel  $x$  :

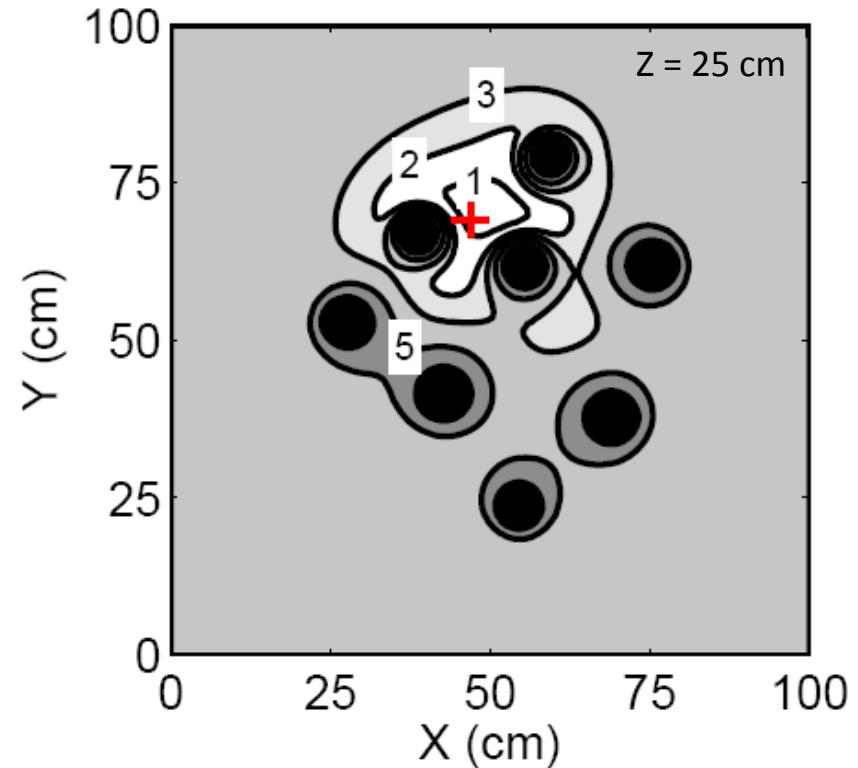
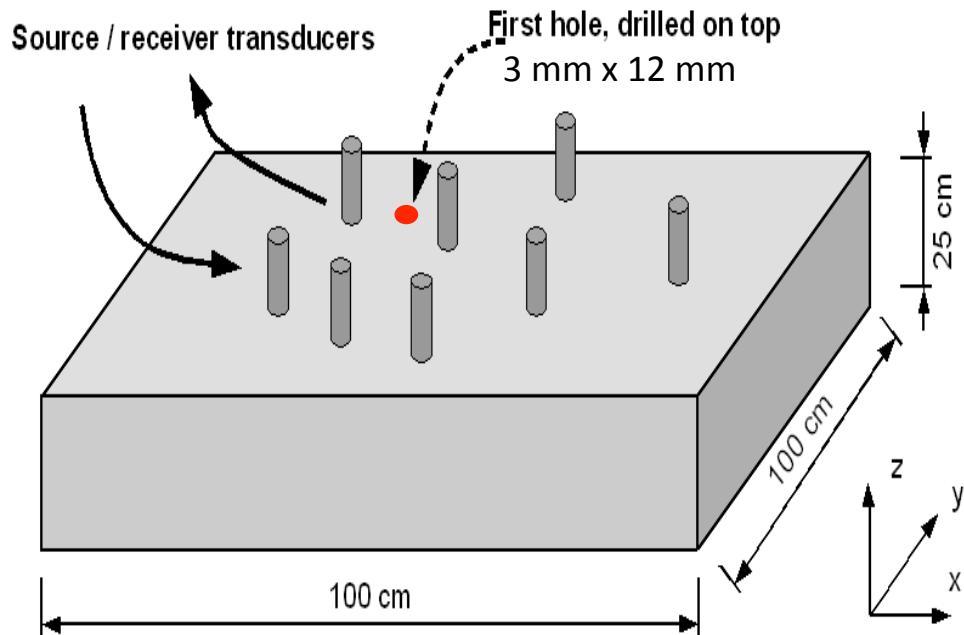
$$\rightarrow Q_{ij}^{th}(S_i, R_j, x, t)$$

**Theoretical decorrelation**

$(x, \sigma)$  that minimizes the misfit ?

# Experimental results on concrete

Larose et al. [Appl. Phys. Lett. 2010]



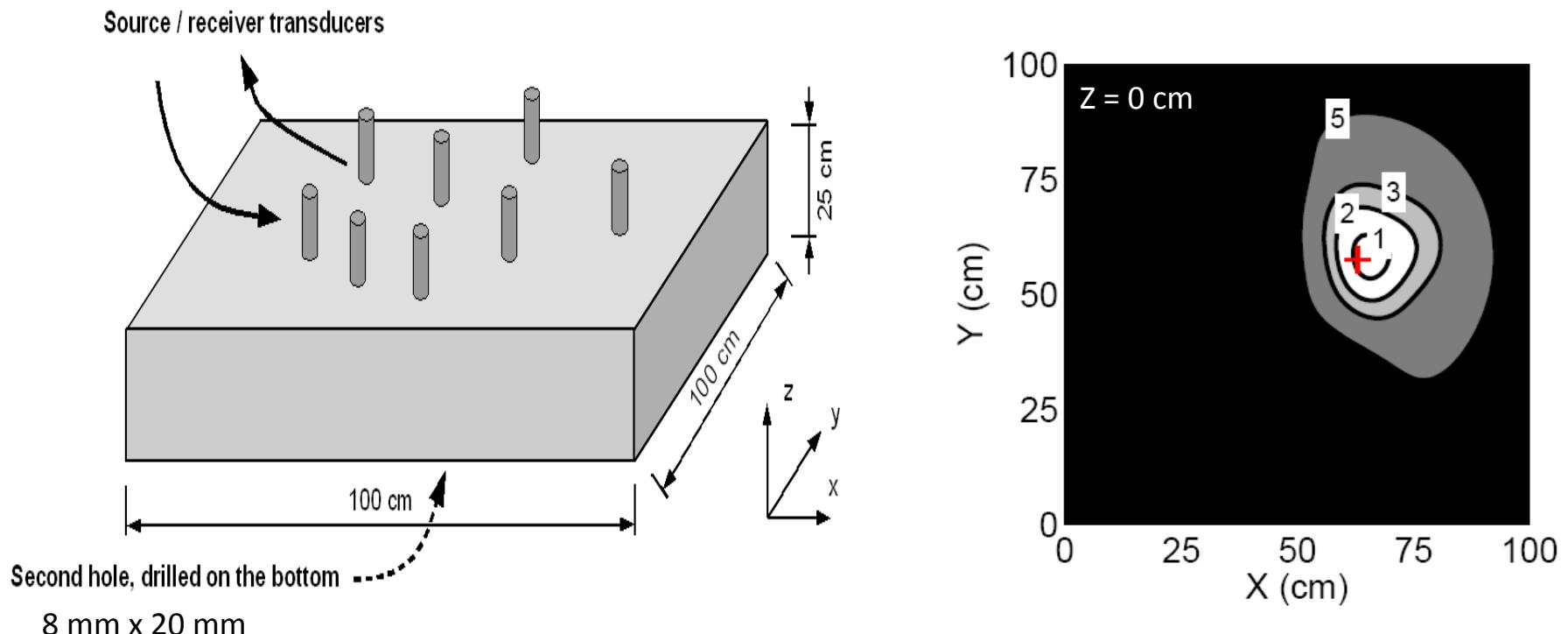
$$\chi^2(x) = \frac{1}{N} \sum_{i,j} (Q_{ij}^{\text{exp}}(t) - Q_{ij}^{\text{th}}(x, t))^2 / \varepsilon^2$$

N : number of transducer pairs

$\varepsilon$  : measurement error

# Experimental results on concrete

Larose et al. [APL 2010]

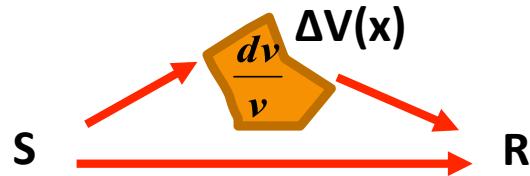


$$\chi^2(x) = \frac{1}{N} \sum_{i,j} (Q_{ij}^{\text{exp}}(t) - Q_{ij}^{\text{th}}(x, t))^2 / \varepsilon^2$$

N : number of transducer pairs

$\varepsilon$  : measurement error

# Theoretical model predicting the stretching factor induced by a local velocity change



Time-lapse travel time change : Pacheco and Snieder [JASA 2005]

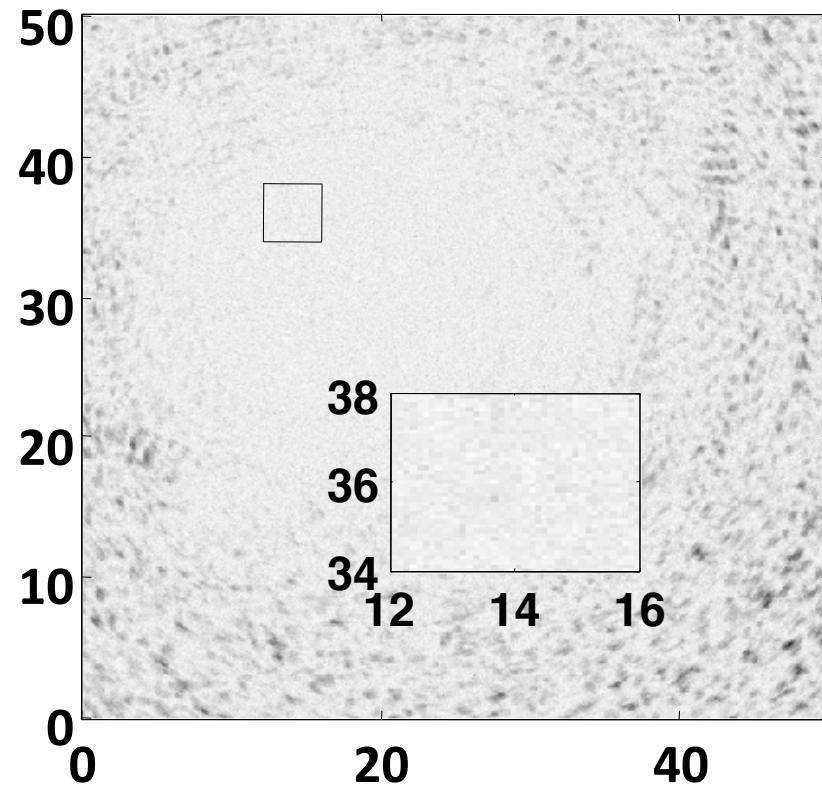
## Theoretical stretching factor

$$\varepsilon^{\text{th}}(S, R, x, t) = \frac{d\nu}{\nu} \frac{\Delta V}{t} \frac{\int_0^t g(S, x, u)g(x, R, t-u)du}{g(S, R, t)}$$

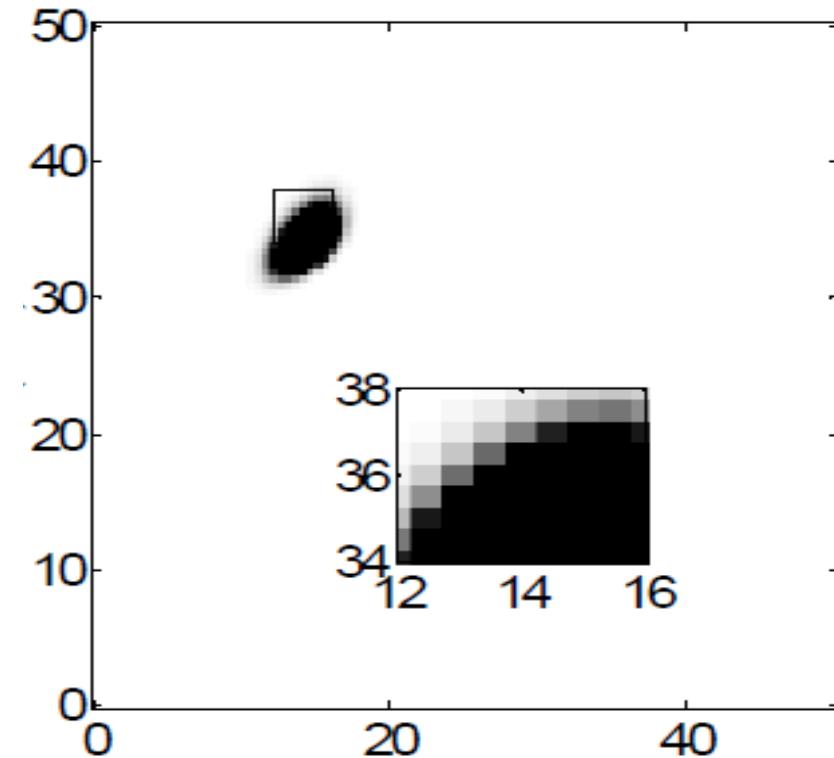
- $g(S, R, t)$ = intensity propagator (diffusion solution, radiative transfer)
- $\frac{d\nu}{\nu}$  : local relative velocity change
- $\Delta V$  : elementary volume centered on  $x$

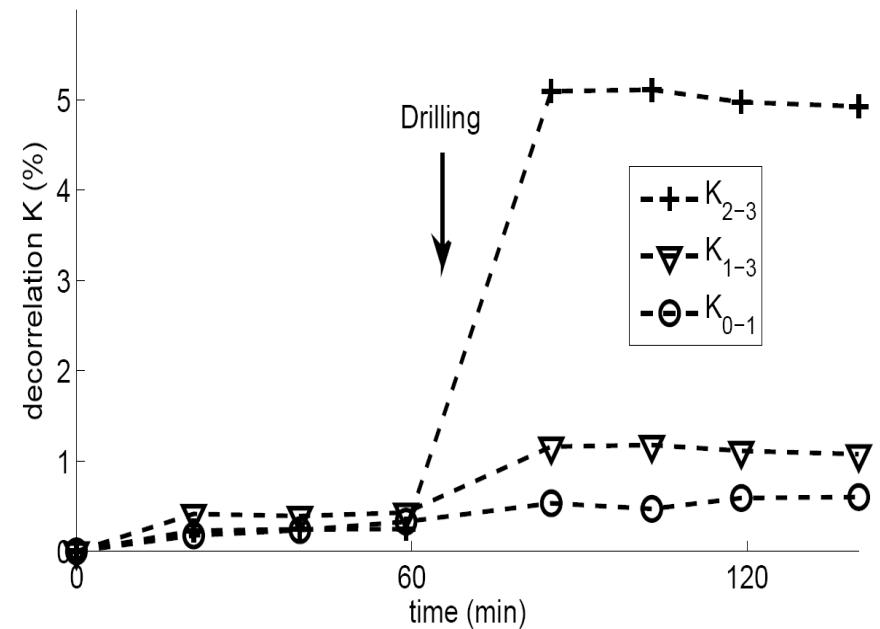
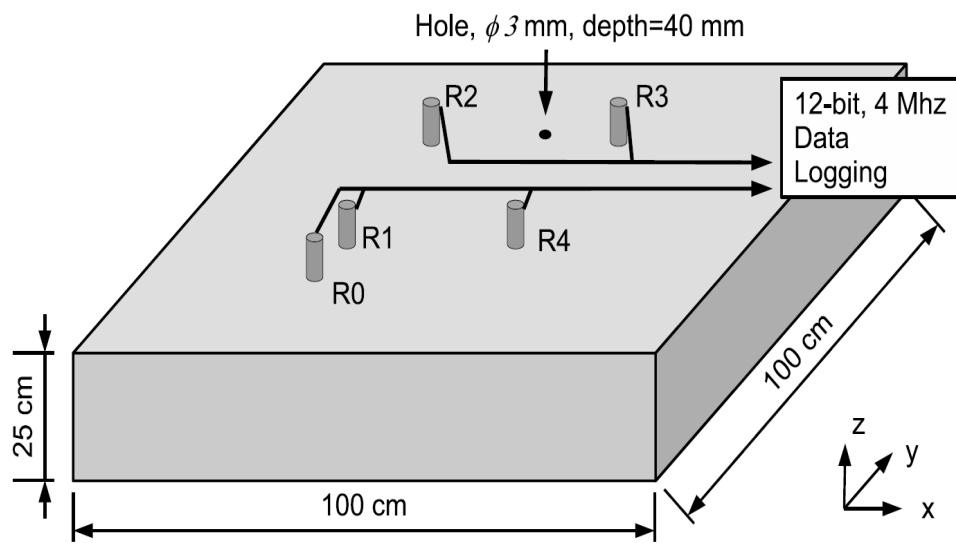
# Results from numerical example

Standard imaging

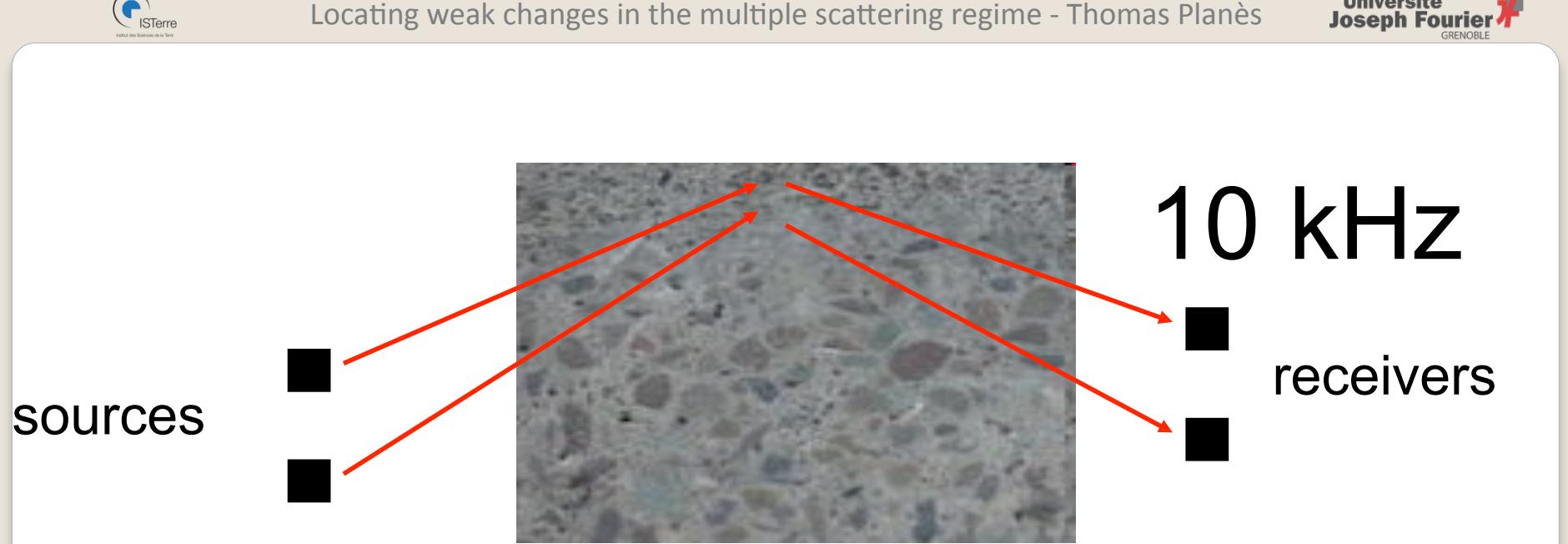


LOCADIFF

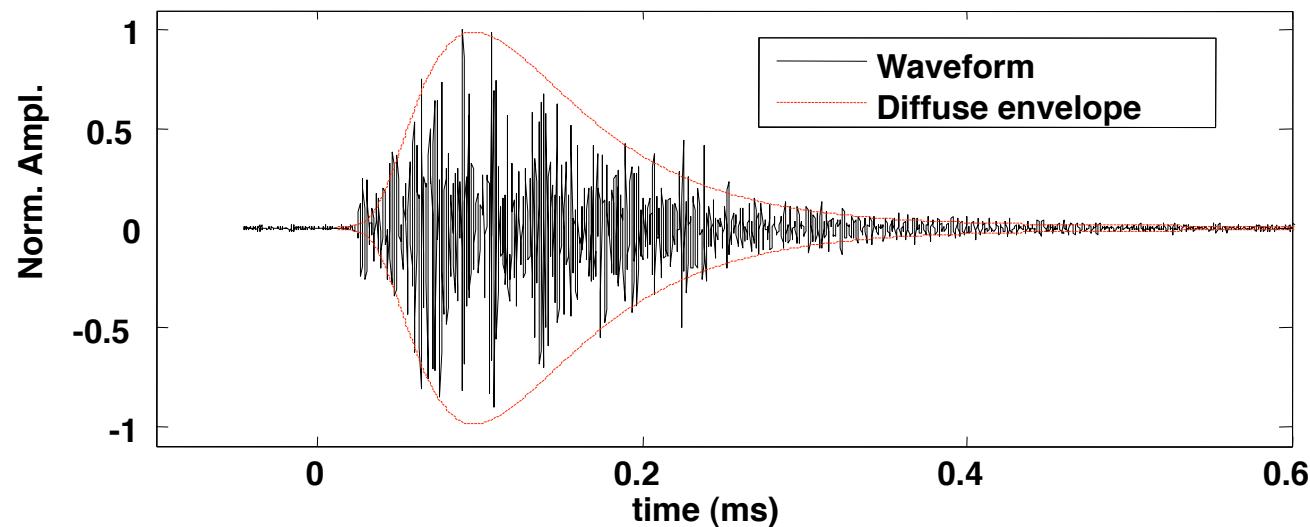




$$\chi^2(\mathbf{x}) = \sum_{i,j} \left( K_{ij}^d(t) - K_{ij}^n(\mathbf{x}, t) \right)^2 / \epsilon^2$$



$$c=2500 \text{ m.s}^{-1}, \lambda=1 \text{ cm}, \ell^*=3 \text{ cm}, \ell_{\text{abs}}=50 \text{ cm}$$

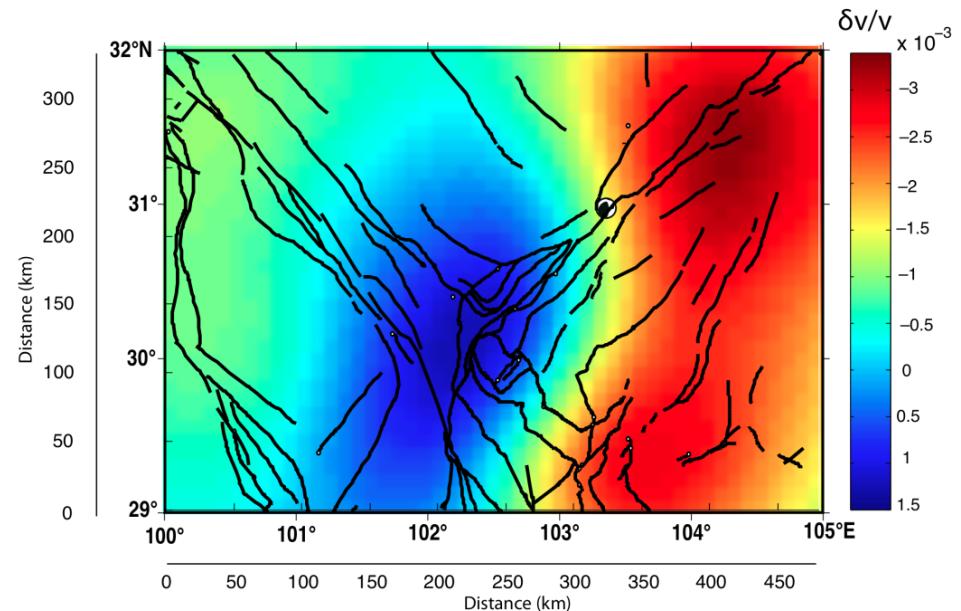
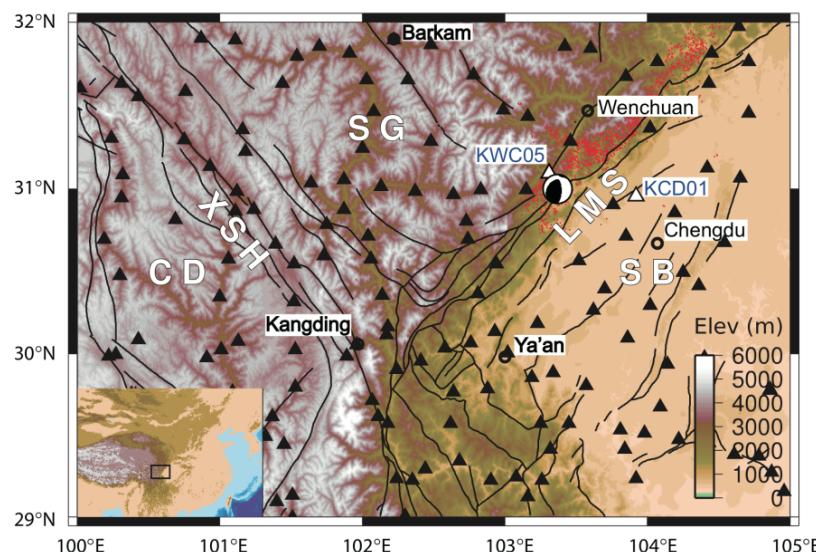


$$c=2500 \text{ m.s}^{-1}, \lambda=1 \text{ cm}, \ell^*=3 \text{ cm}, \ell_{\text{abs}}=50 \text{ cm}$$

# Passive seismic data inversion

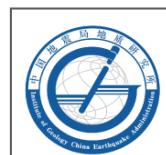
Berenice Froment (Phd), Michel campillo

Wenchuan earthquake (May 12, 2008)  
Longmen Shan fault zone, Sichuan province, China



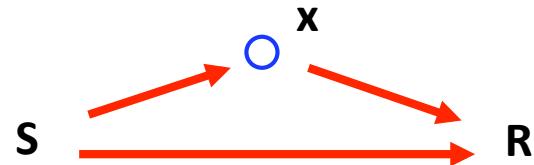
## Data:

- . 156 broadband stations
- . 2 years of noise (2007-2008)
- . run by the Institute of Geology of the China Earthquake Administration



## Relative velocity change map

# Theoretical model predicting the decorrelation induced by an extra scatterer



Rôle of an extra scatterer :  
Nieuwenhuizen & Van Rossum [1993]

## Theoretical decorrelation

$$Q^{\text{th}}(x, t) = \frac{c\sigma}{2} \frac{\int_0^t g(S, x, u)g(x, R, t-u)du}{g(S, R, t)}$$

- $g(S, R, t)$ = Intensity propagator
  - $\sigma$  : scattering cross section
- Rossetto et al. [JAP 2011]

## Sensitivity kernel

$$Q^{\text{th}}(x, t) = \frac{c\sigma}{2} K(x, t)$$

