

# A Correlation-based Misfit Criterion for Wave-equation Traveltime Tomography

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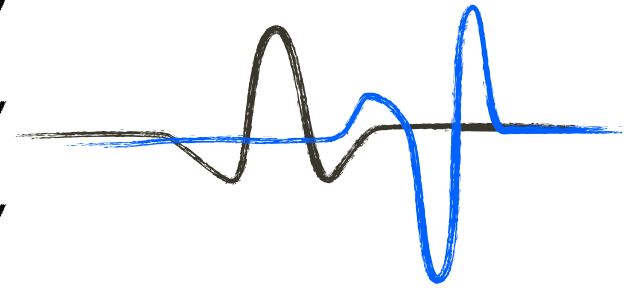
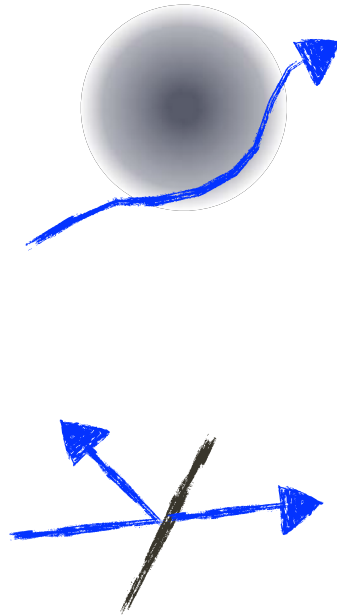
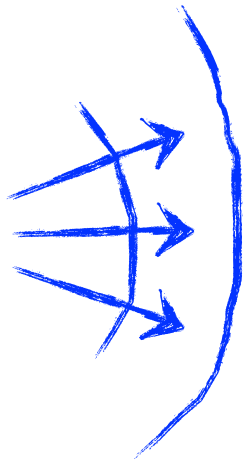
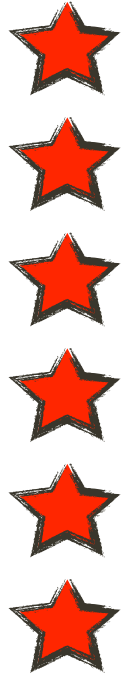
**SLIM** 

University of British Columbia

ICIAM 2011 – MS102:

Contemporary Issues in Geophysical Inversion:  
Imaging and Velocity

# Waveform imaging



# Overview

- Waveform tomography
- Wavefrontset detection
- Misfit criteria
- Numerical example
- Future work & Conclusions

# Waveform tomography

Model the data as

$$\left[ \frac{1}{c^2} \frac{\partial^2}{\partial t^2} - \nabla^2 \right] u = w(t) \delta(x - s),$$
$$d(t, s, r) = u(t, x, s)|_{x=r} \equiv F[c].$$

Goal is to find the velocity given  
the data and source signature

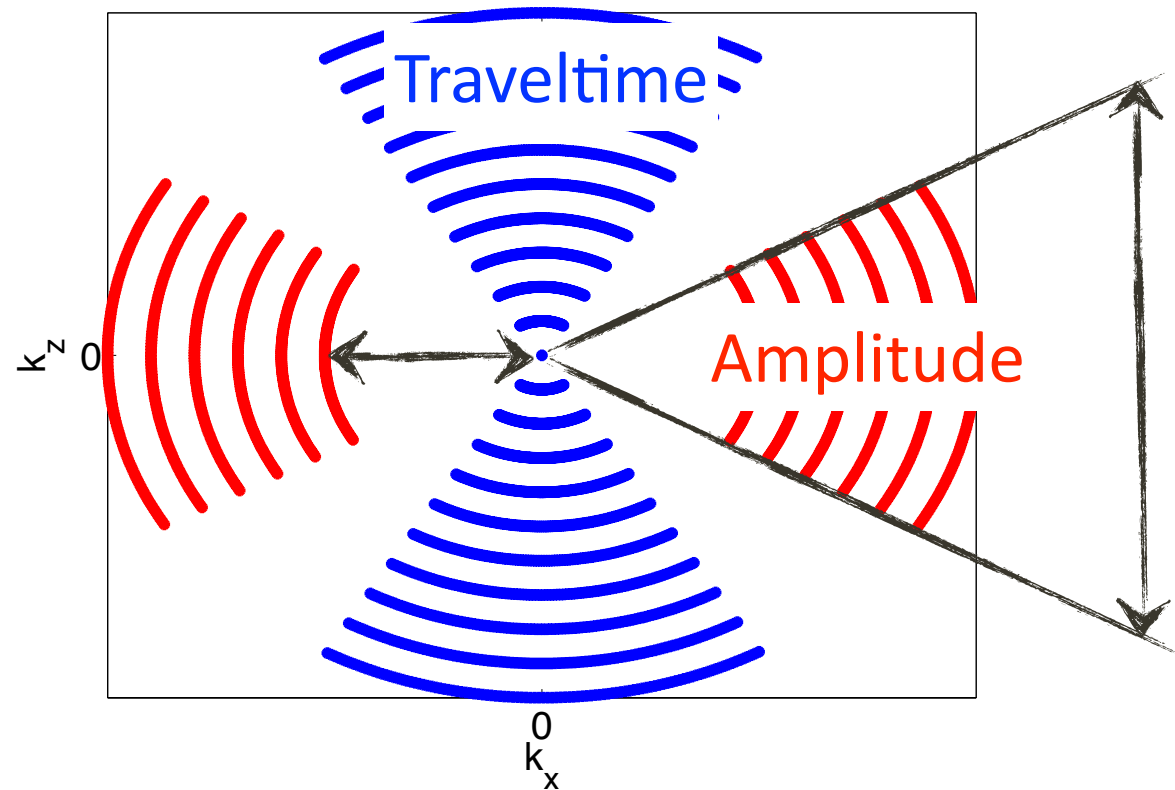
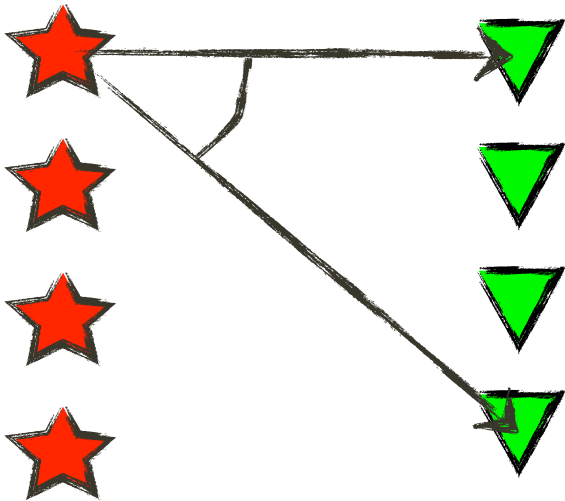
# Waveform tomography

Such inverse problems have been extensively studied. Major findings:

- recovery via LS is problematic for bandlimited data
- some form of traveltime fitting needed for `complete' reconstruction

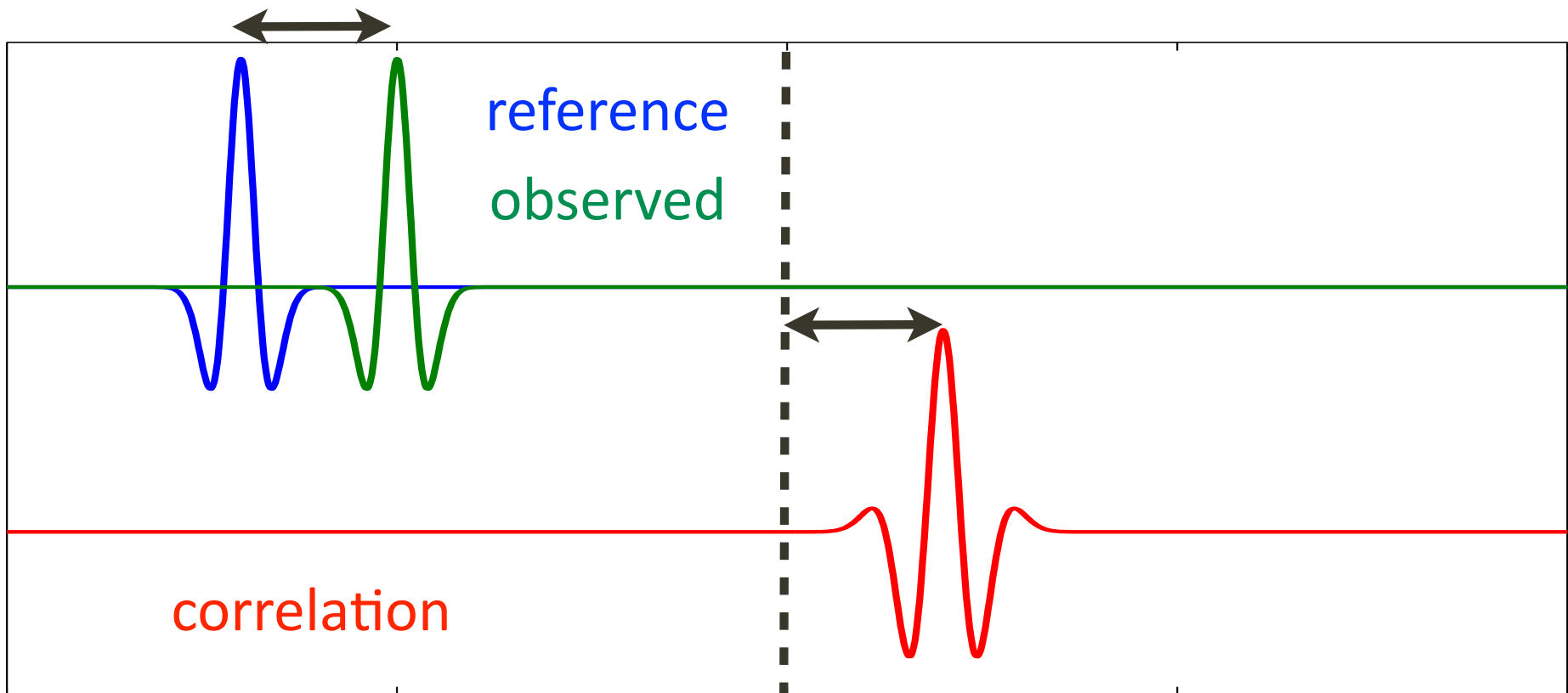
# Waveform tomography

Wavenumber coverage with limited aperture



# Waveform tomography

## Wave-equation travelttime tomography



# Waveform tomography

WE travelttime tomography:

- relies on detecting shift of singular support
- widely used criterion: maximum of the correlation

$$\min_c \|\tau[c]\|_2^2, \quad \tau[c] = \operatorname{argmax}_t (d * \bar{d})(t)$$



# Waveform tomography

LS may be re-formulated as maximizing the normalized zero-lag correlation

$$\|d - \bar{d}\|_2^2 = \|d\|_2^2 + \|\bar{d}\|_2^2 - 2 \underbrace{\langle d, \bar{d} \rangle}_{(\bar{d} * d)|_{t=0}}$$

`picking approach' is a clever extension of this

# Wavefrontset detection

Given a function of the form

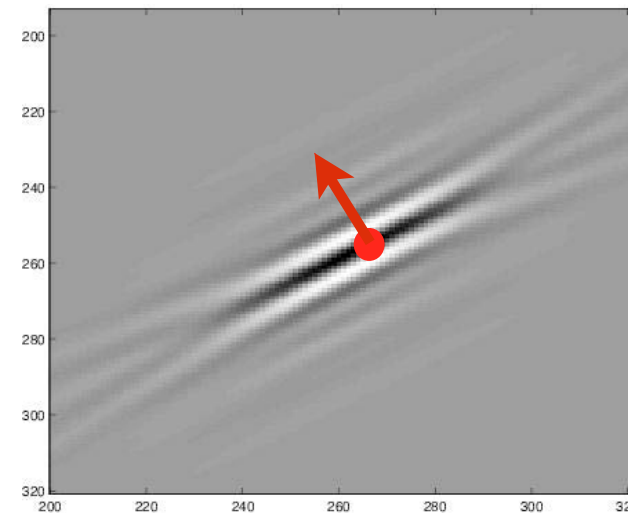
$$f(x, t) = \int d\omega a(\omega, x, t) \exp[i\phi(\omega, x, t)]$$

the wavefrontset is given by

$$\text{WF}(f) \subseteq \{x, t; \partial_x \phi, \partial_t \phi \mid \partial_\omega \phi = 0\}$$

In particular:

$$\text{WF}(\bar{d} * d) \subseteq \{s, r, \bar{T} - T; \nabla(\bar{T} - T), i\omega\}$$



# Wavefrontset detection

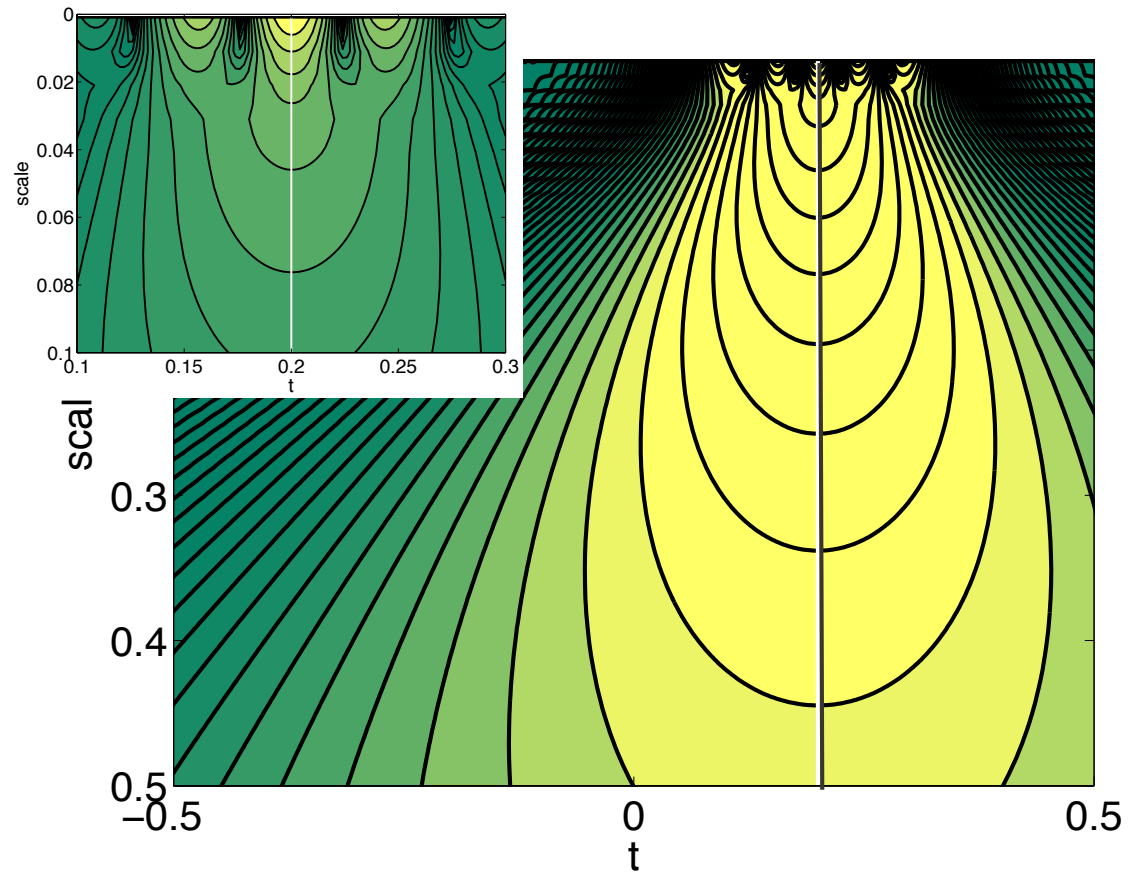
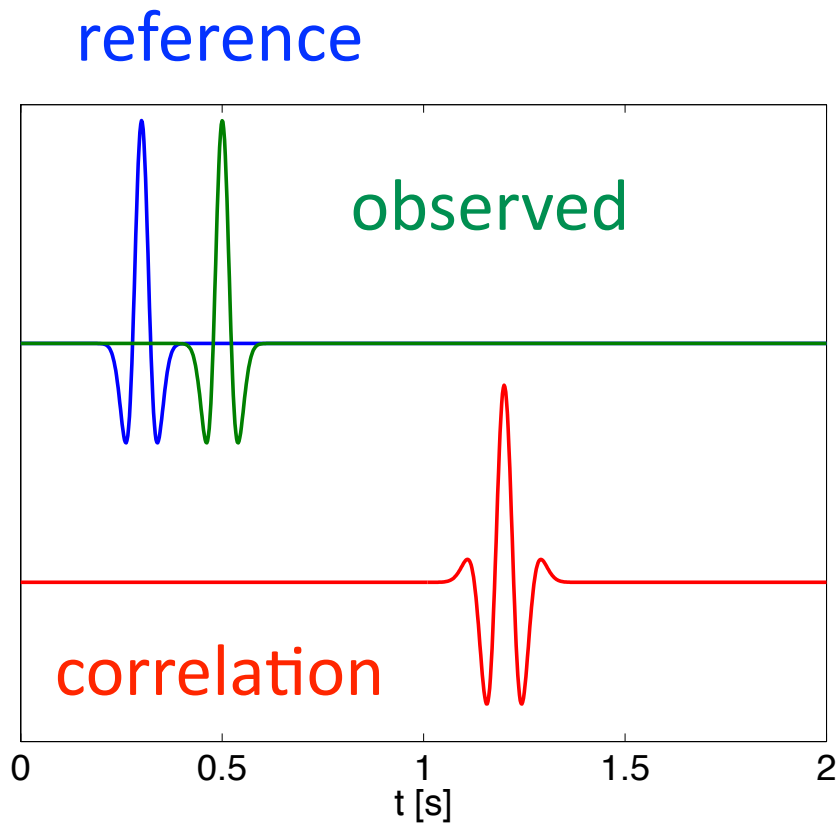
- Multiscale WF detection via the FBI transform:

$$G[f](t, \omega, \sigma) = \frac{1}{\sqrt{\sigma}} \int dt' f(t') W[(t - t')/\sigma] \exp[i\omega t']$$

- if  $t \notin \text{WF}(f)$  then for fixed  $\omega$  and any  $N \in \mathbb{N}$

$$|G[f](t, \omega, \sigma)| \leq \sigma^N \quad \text{as } \sigma \downarrow 0$$

# Wavefrontset detection

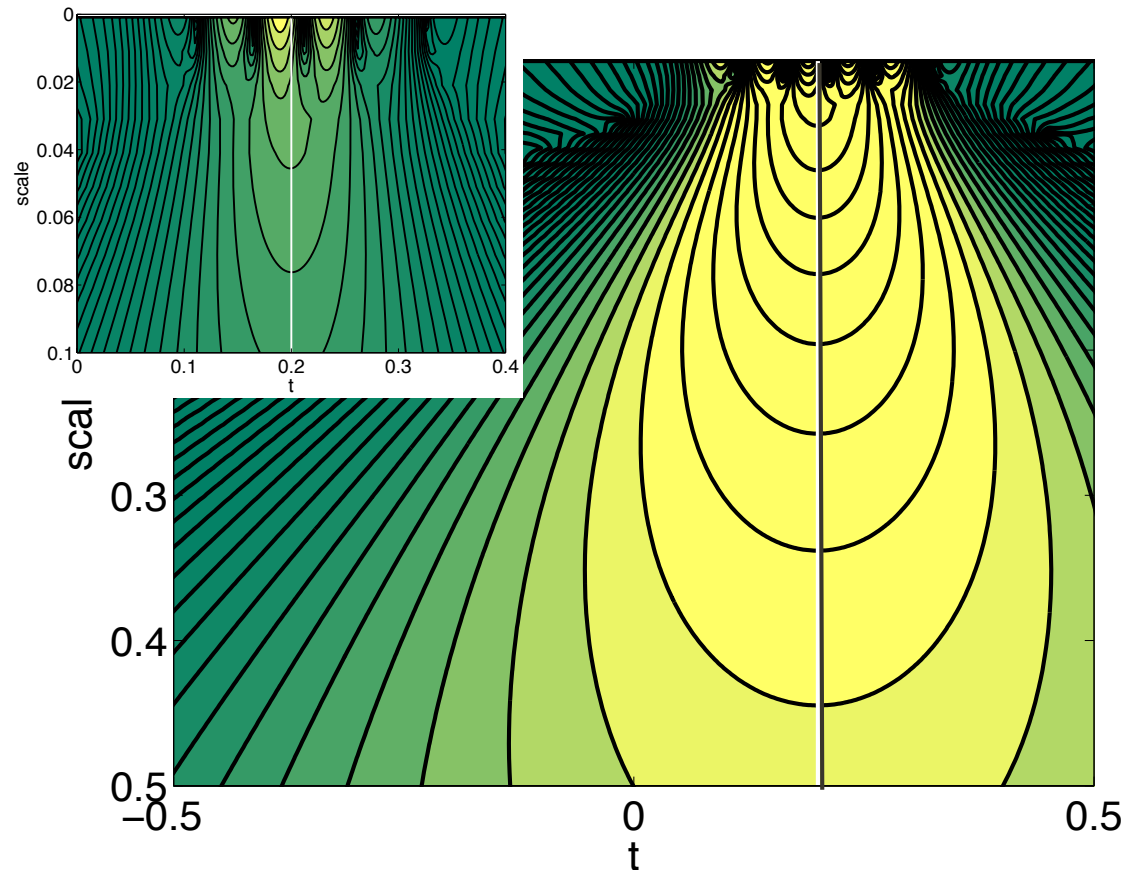
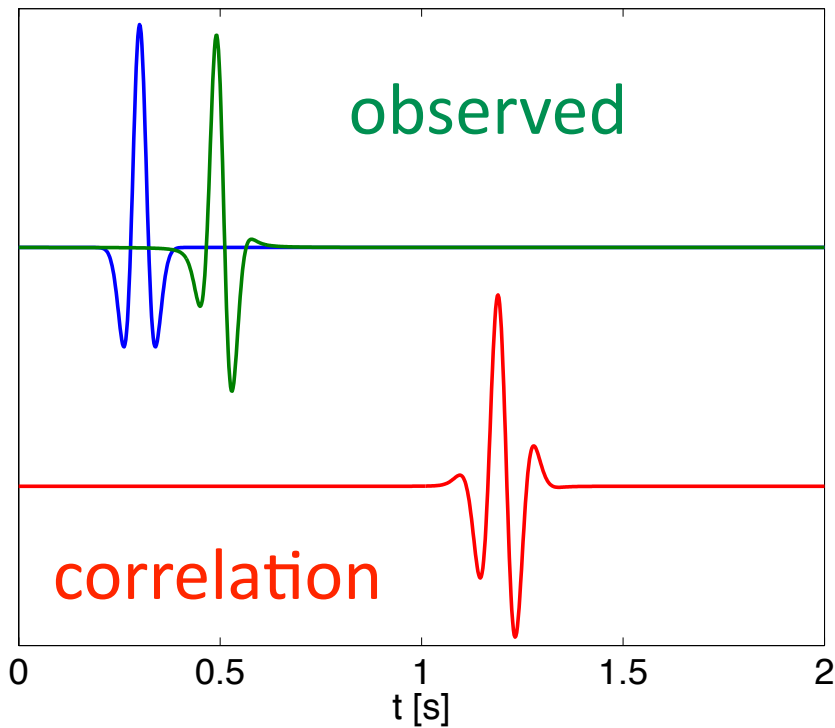


# Wavefrontset detection

reference

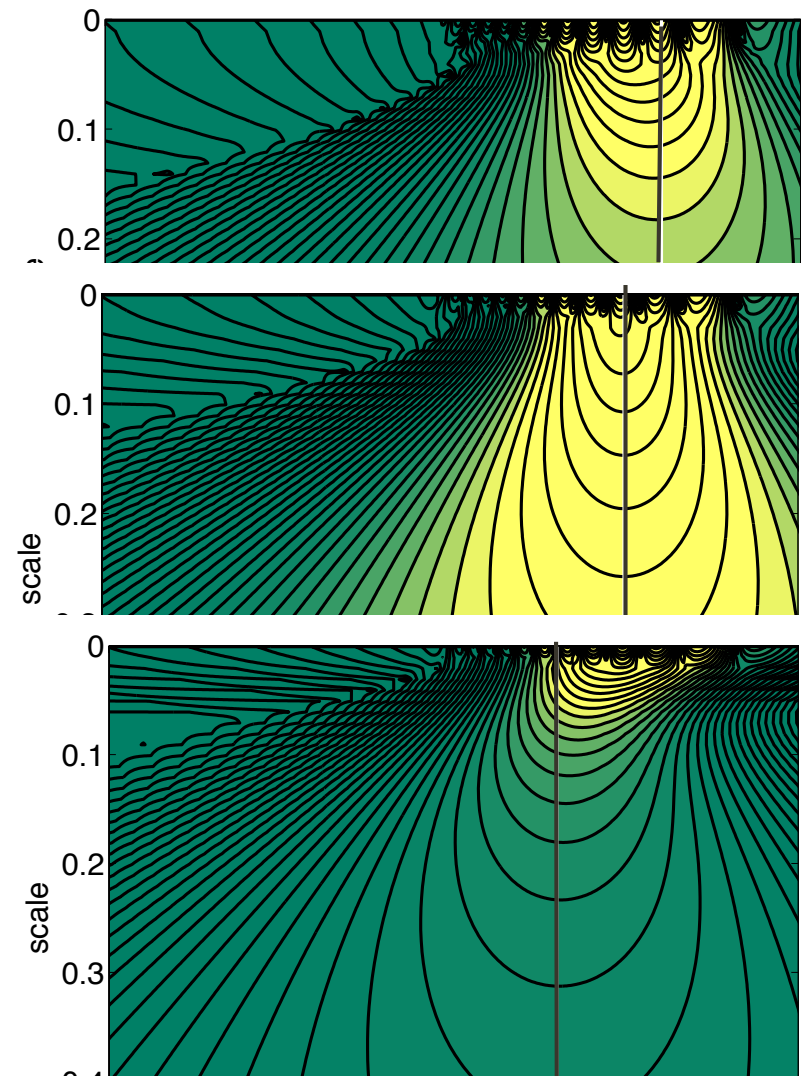
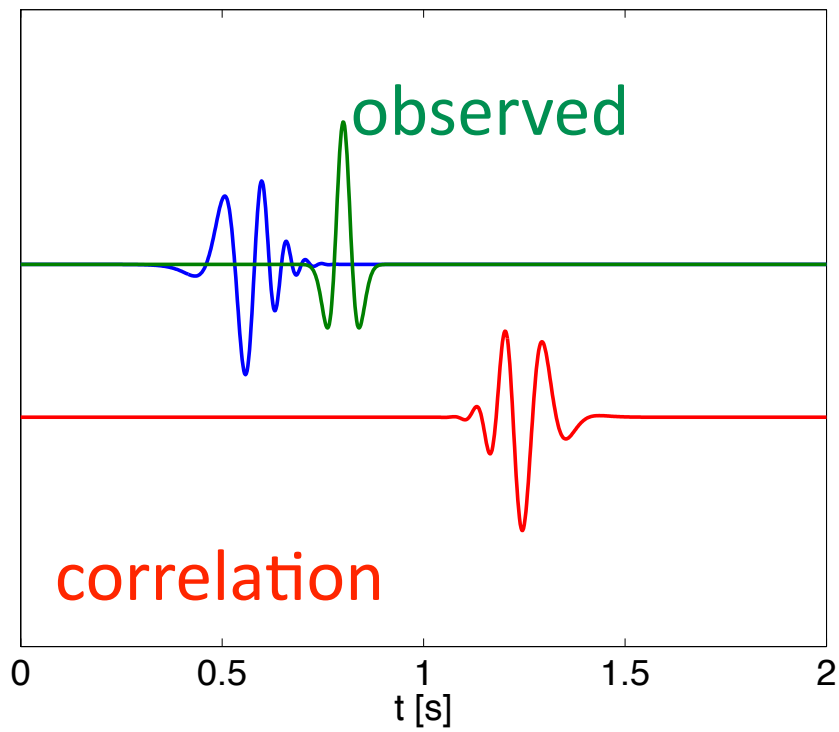
observed

correlation



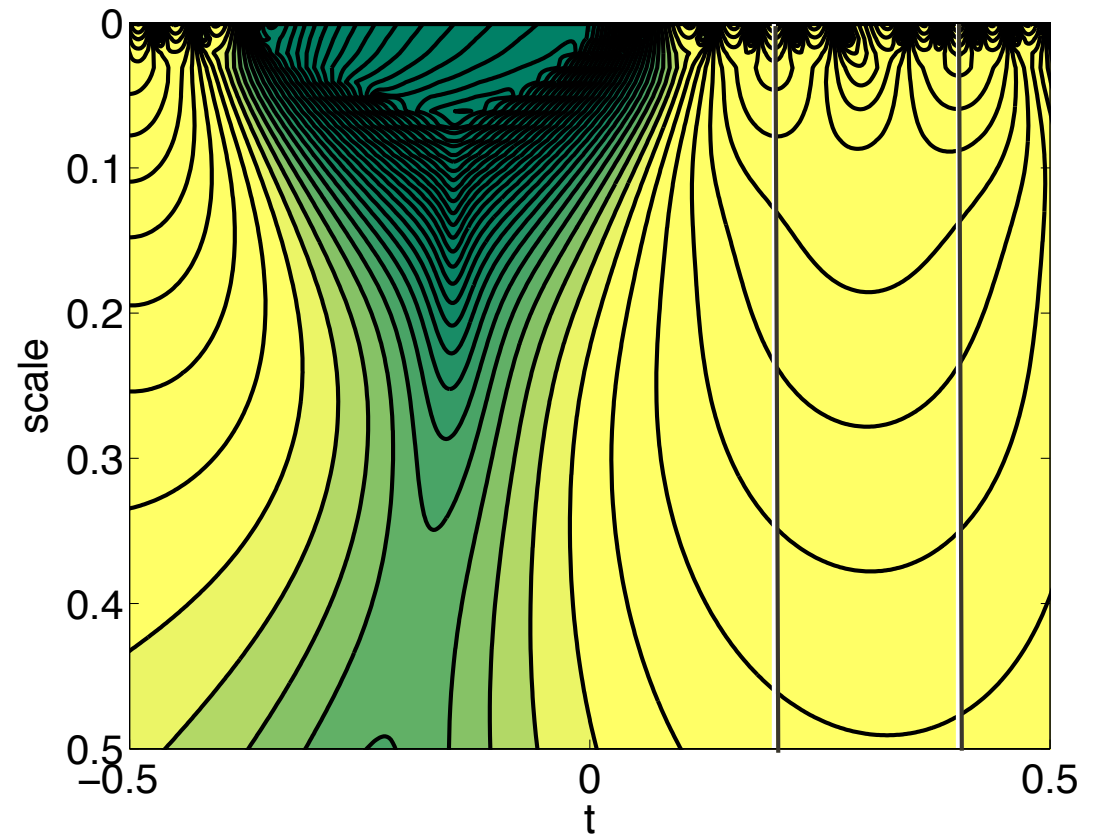
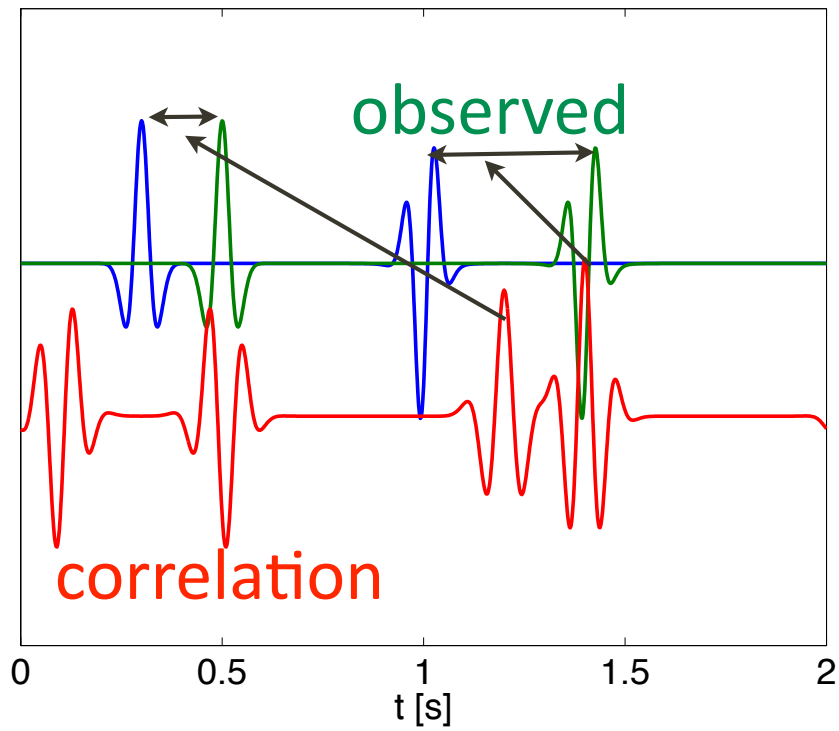
# Wavefrontset detection

reference

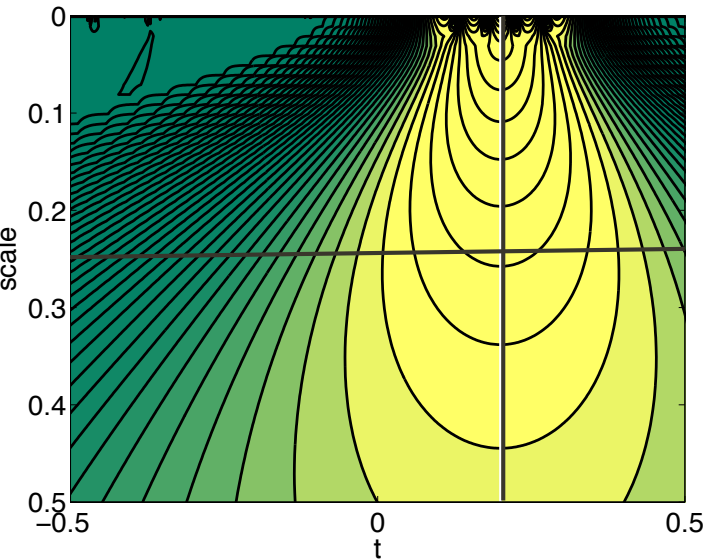


# Wavefrontset detection

reference



# Misfit criteria



- $\tau[\omega, \sigma] = \operatorname{argmax}_t G[\bar{d} * d](t, \omega, \sigma)$   
converges to picking approach as  
 $\sigma \downarrow 0$  and  $\omega = 0$
- Maximize  $\|G[\bar{d} * d](0, \cdot, \sigma)\|_2^2$
- Minimize  $\|\partial_t G[\bar{d} * d](0, \cdot, \sigma)\|_2^2$



# Misfit criteria

Rewrite:

$$G[f](0, \omega, \sigma) = (\widehat{W_\sigma \cdot f})(\omega)$$

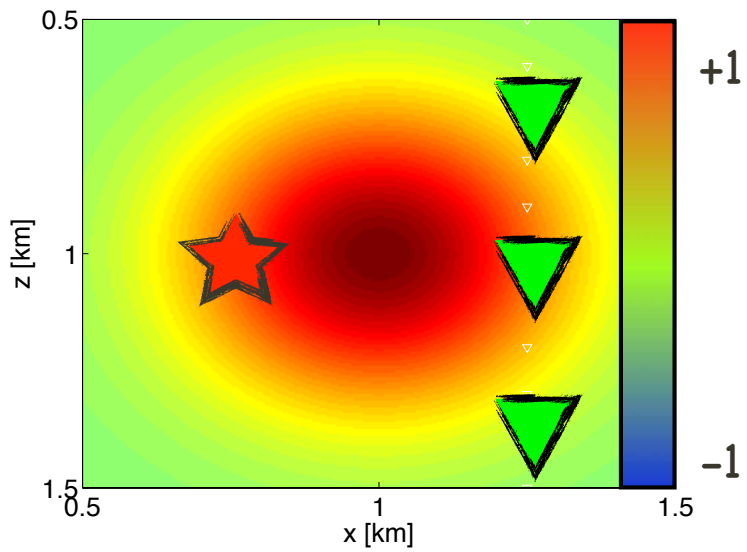
$$\partial_t G[f](0, \omega, \sigma) = (\widehat{W'_\sigma \cdot f})(\omega)$$

where  $W_\sigma(t) = \frac{1}{\sqrt{\sigma}} \exp[-(t/\sigma)^2]$

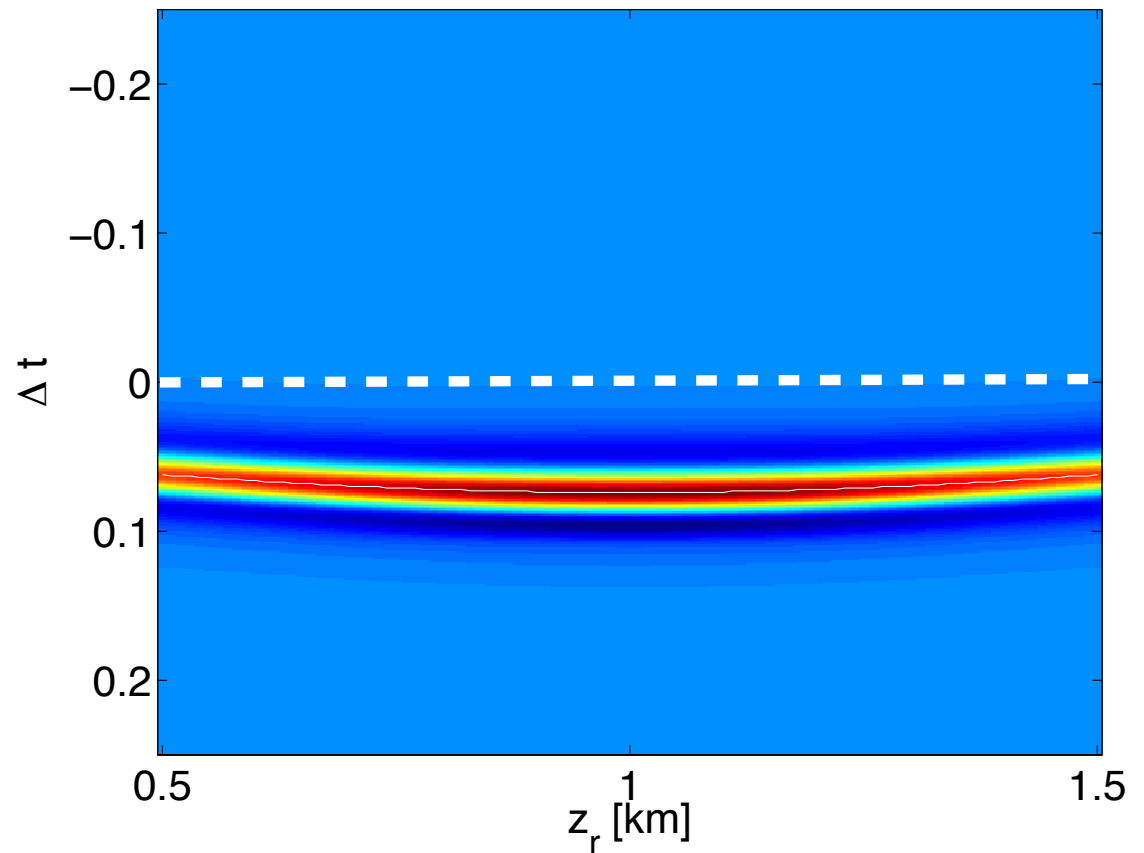
Misfit:

$$\phi = \frac{\|W_\sigma \cdot (\bar{d} * d)\|_2^2}{\|d\|_2^2}$$

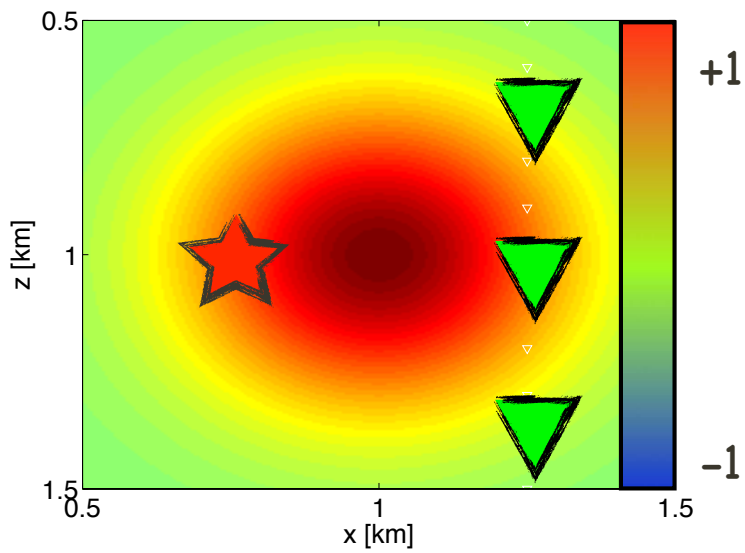
# Misfit criteria



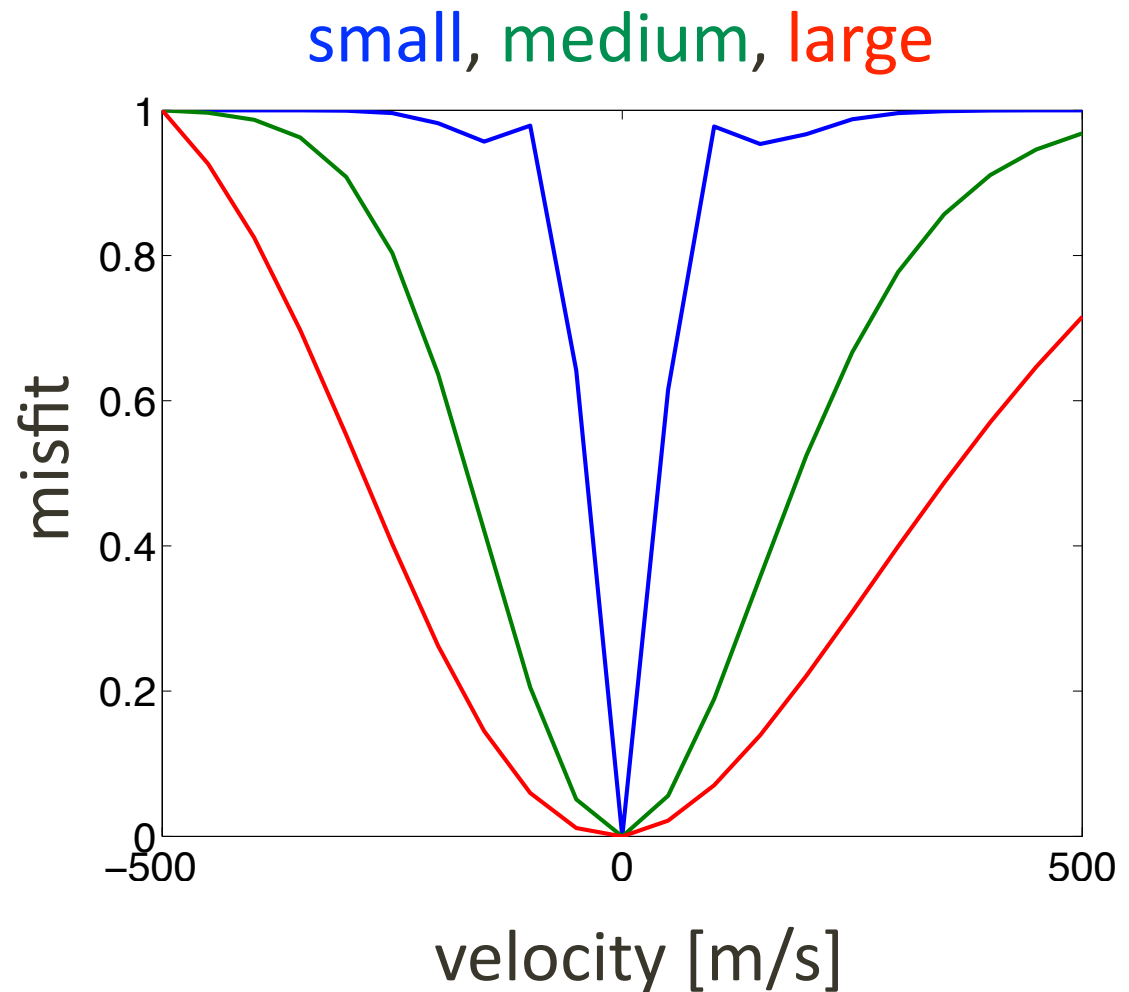
velocity perturbation



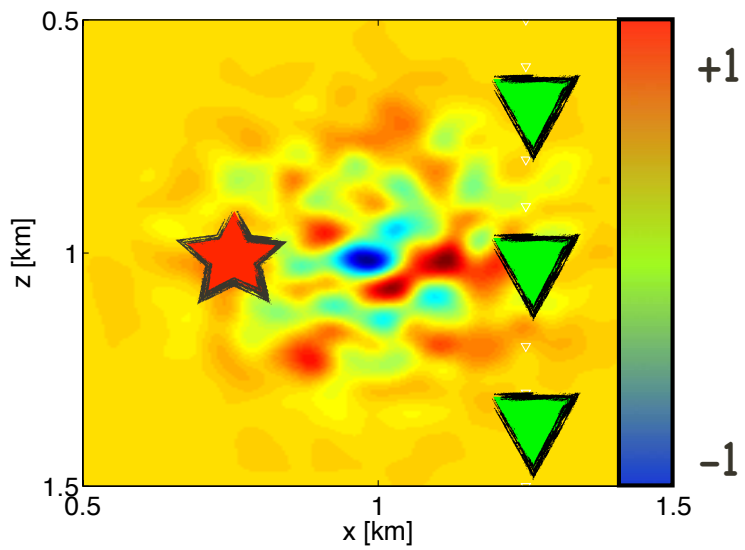
# Misfit criteria



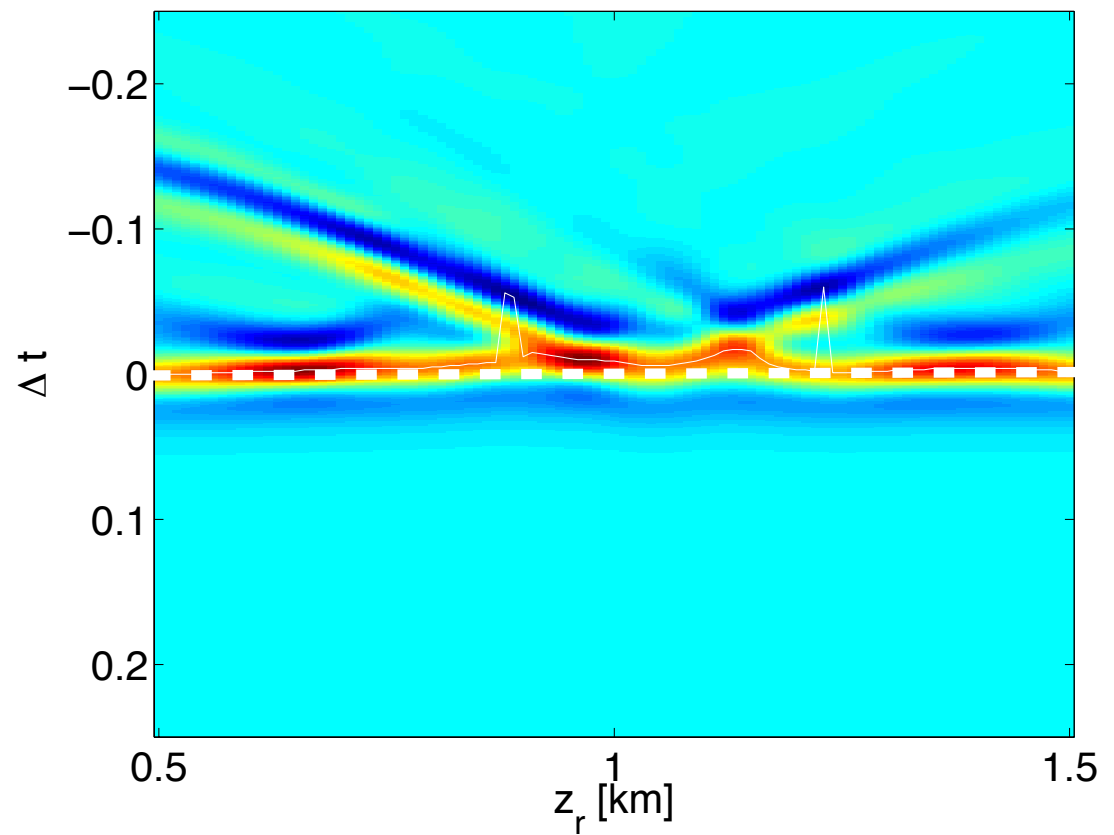
velocity perturbation



# Misfit criteria

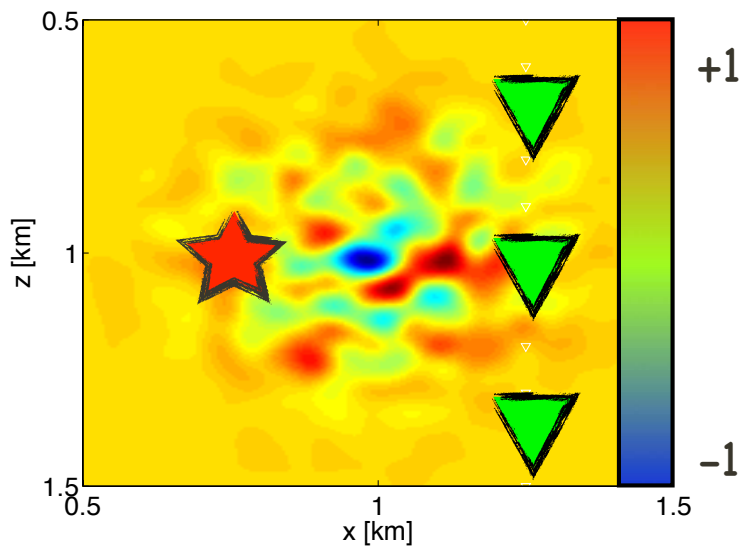


velocity perturbation

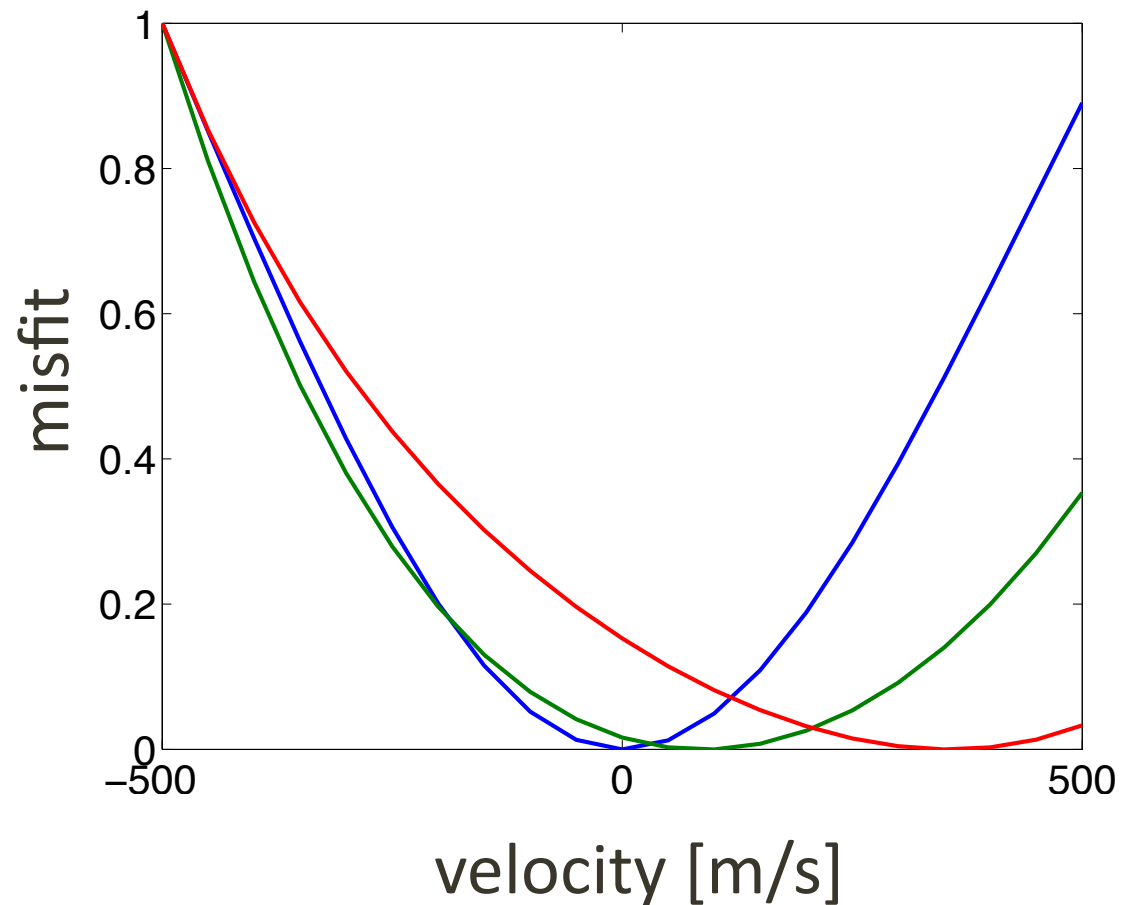


# Misfit criteria

small, medium, large



velocity perturbation

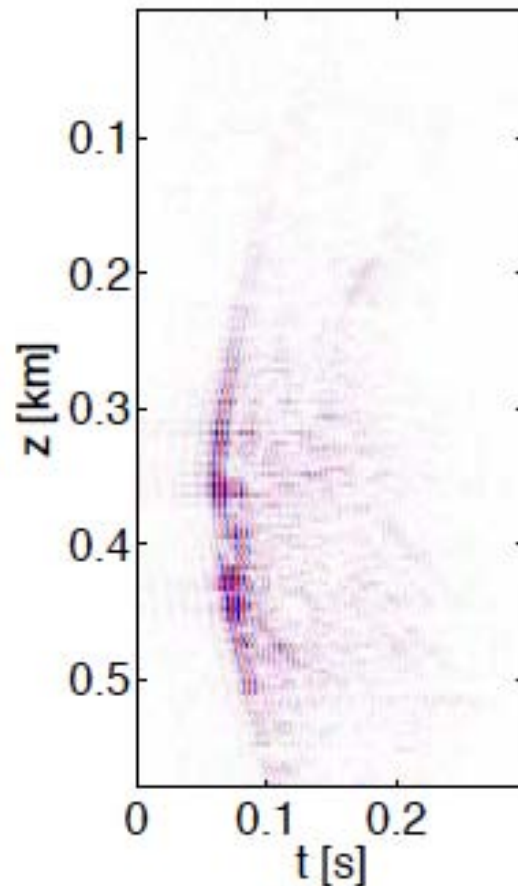
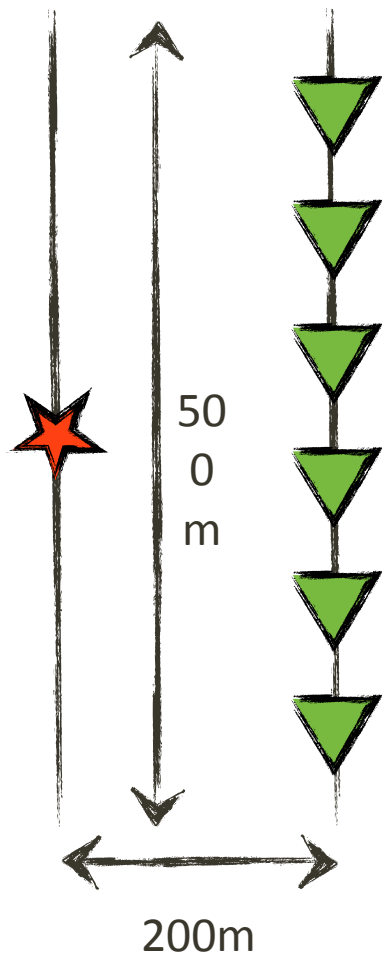


# Misfit criteria

Multiscale WF detection allows us to move from

- Traveltime fitting at large scale
- to
- `Stack power' at small scale

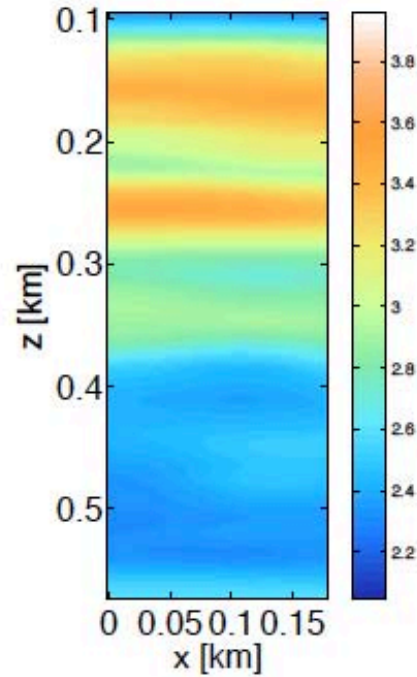
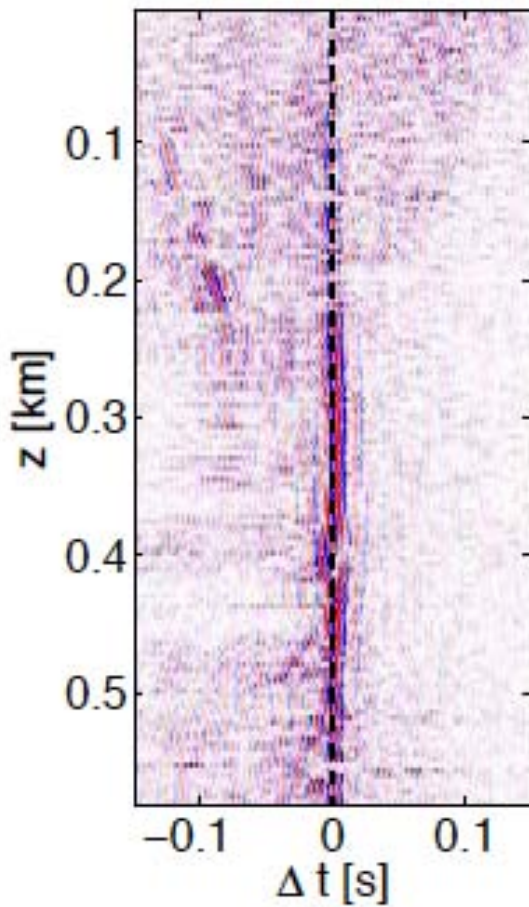
# Numerical example II



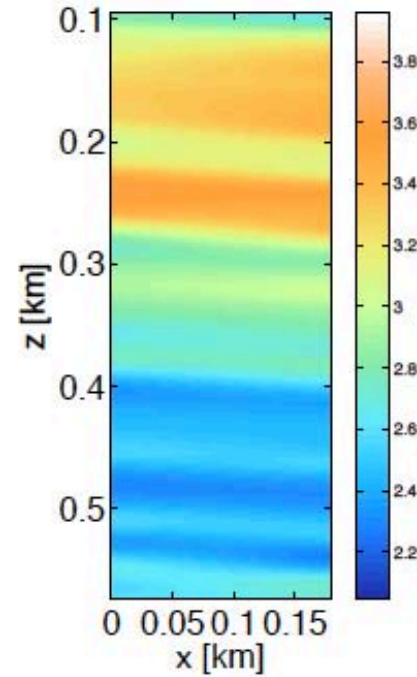
[TvL 10; ]

- Real cross-well data set
- Frequency domain FD
  - Adjoint-state for gradient
  - L-BFGS for optimization
  - different stages using different basis functions

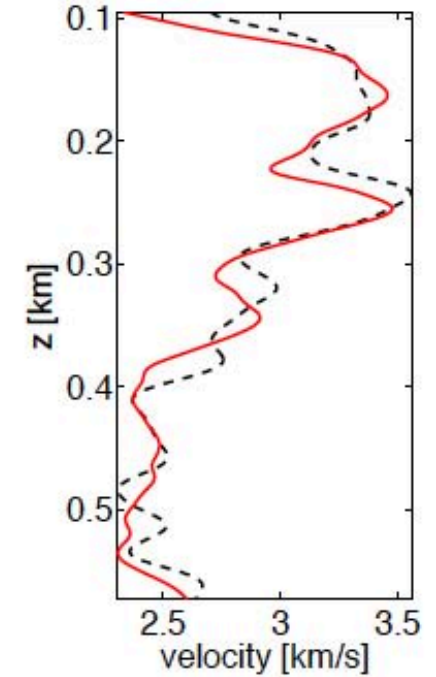
# Numerical example



result



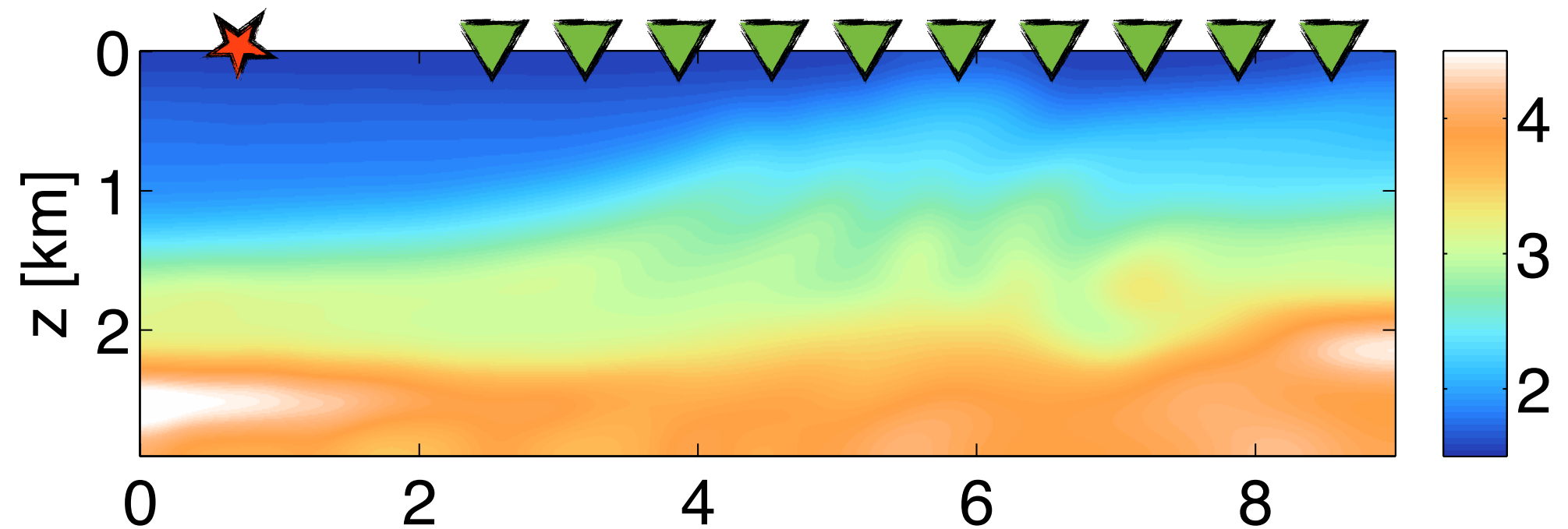
reference



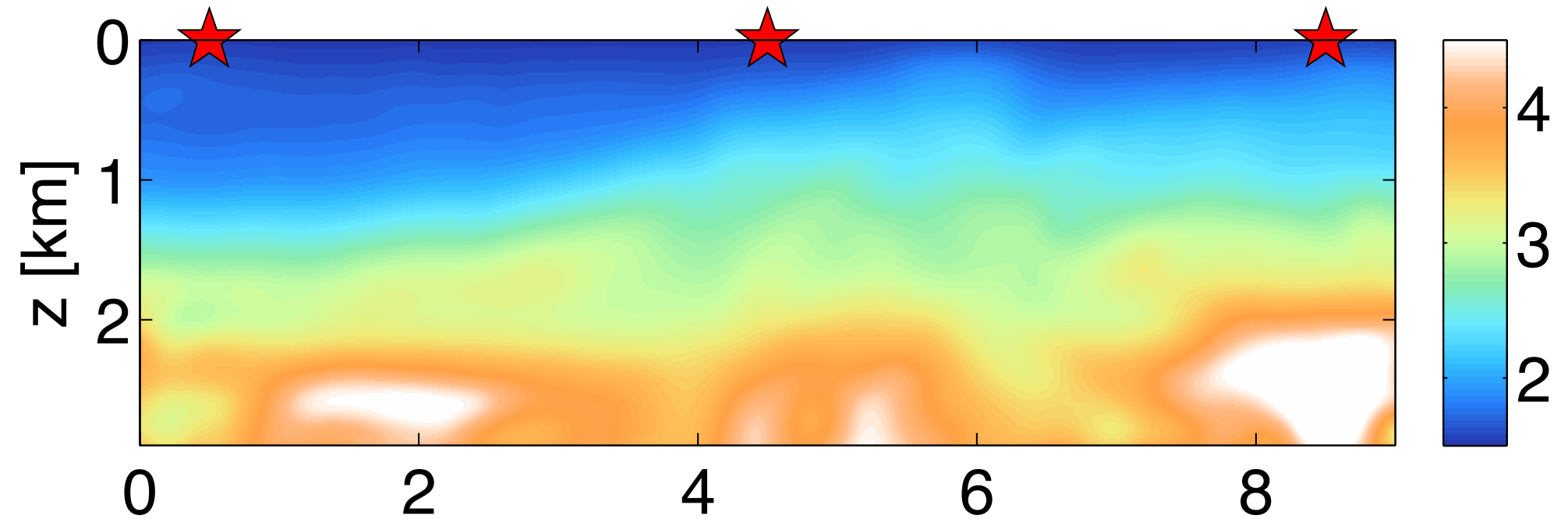
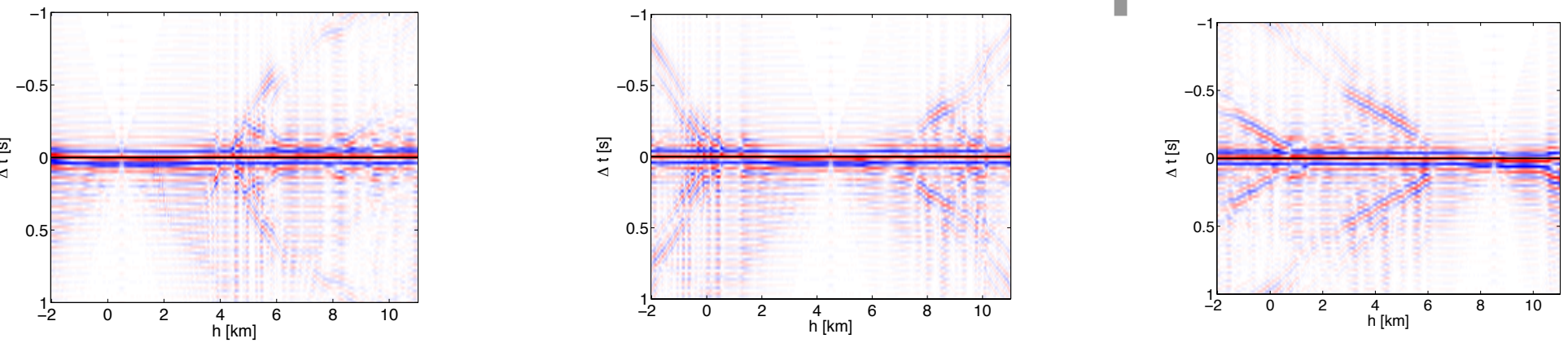


# Numerical example II

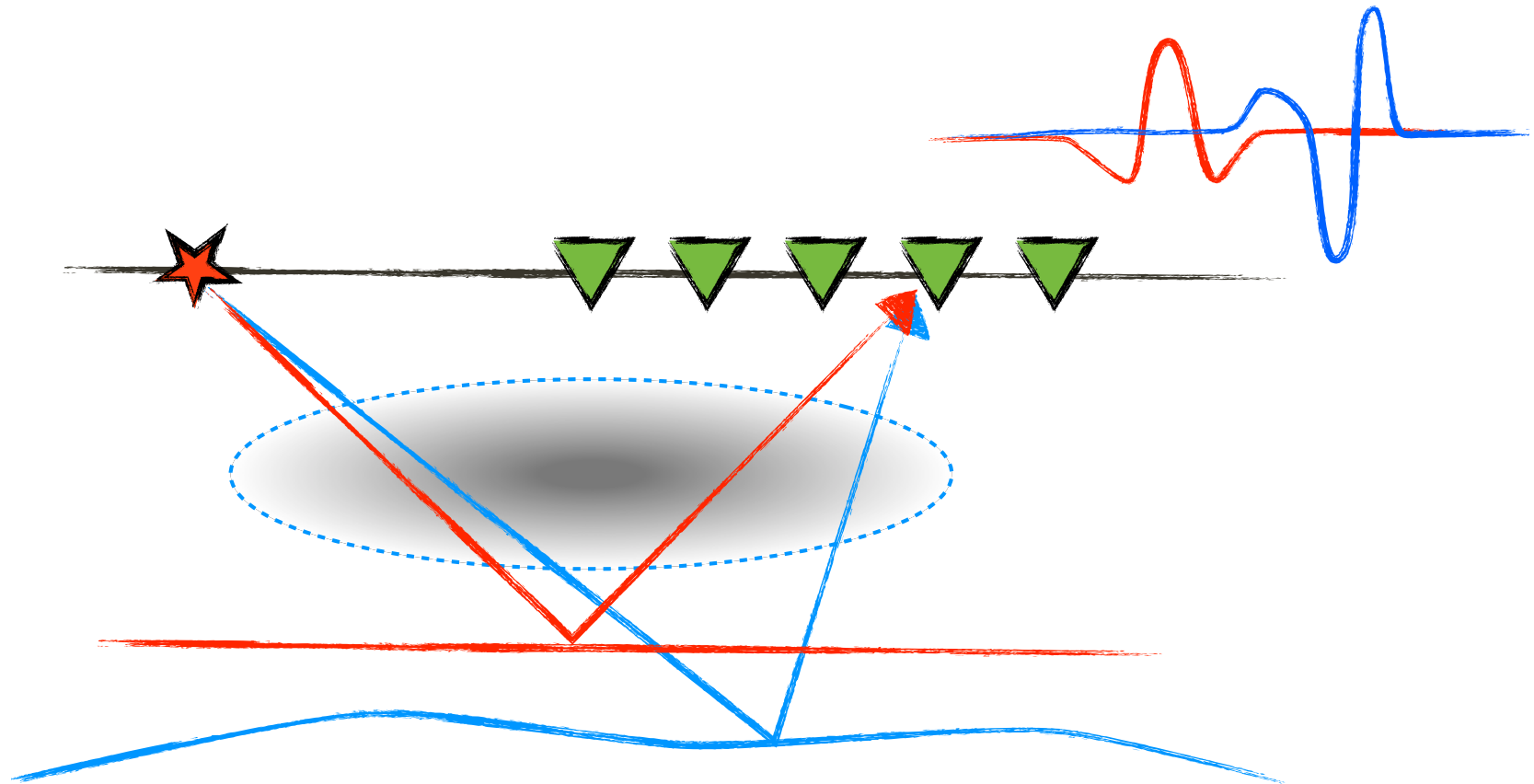
'Diving-wave tomography'



# Numerical example II

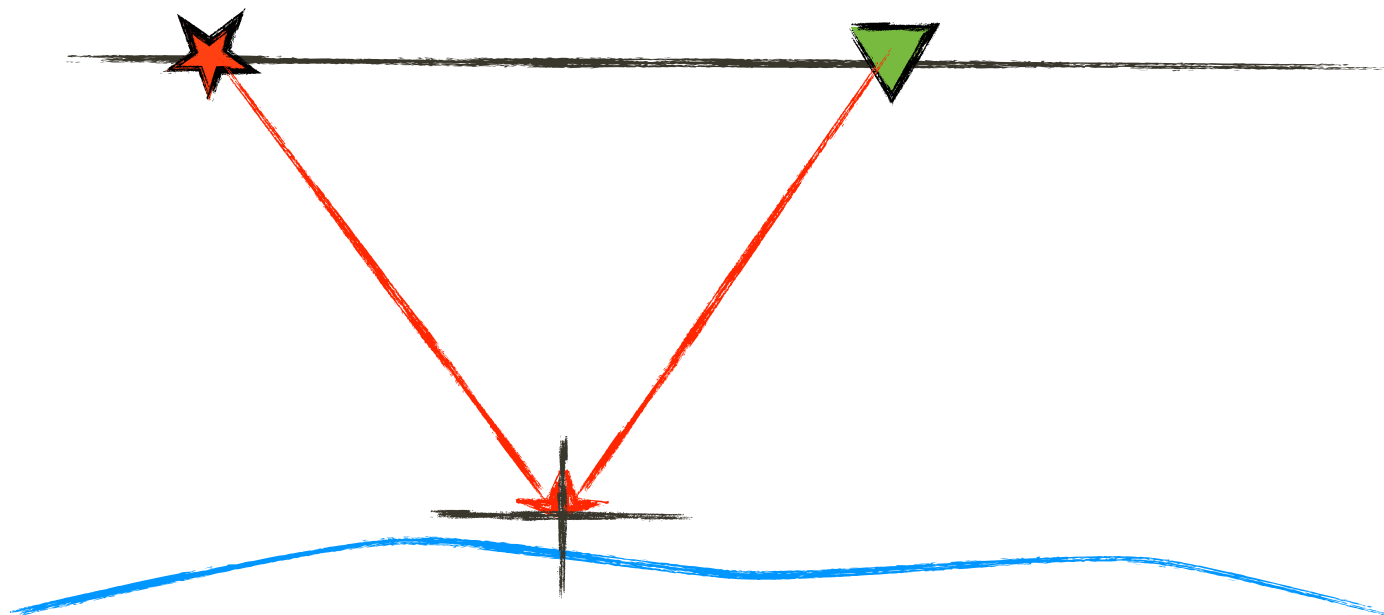


# Reflection tomography



# Reflection tomography

- Correlate wavefields in space ( $\Delta x, \Delta z$ )
- Produces *image volume*
- Measure focusing with Gaussian weight



[Claerbout ; Rickett; Sava ;Symes]

# Reflection tomography

Spatial correlation:

$$E = VU^*$$

where  $HU = \textcircled{Q}$  and  $H^*V = \textcircled{R}$

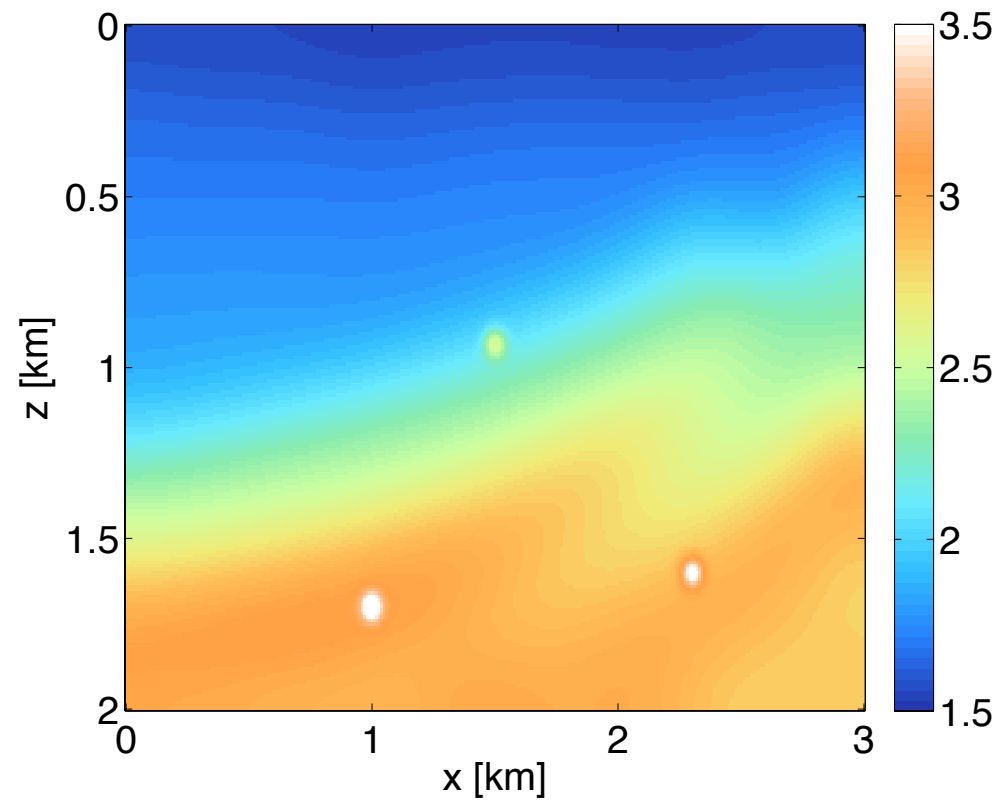
many r.h.s. !!

Action on a vector:

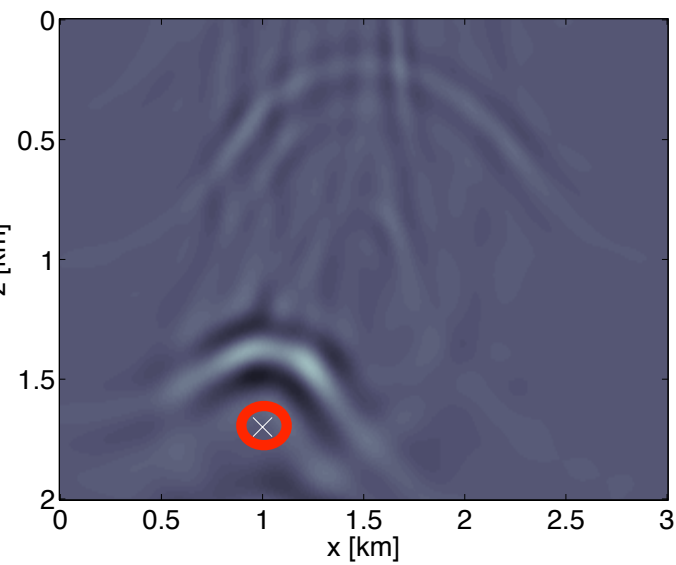
$$E\mathbf{x} = V \underbrace{(U^*\mathbf{x})}_{\mathbf{y}} = H^{-*}(\textcircled{R}\mathbf{y})$$

one r.h.s. !!

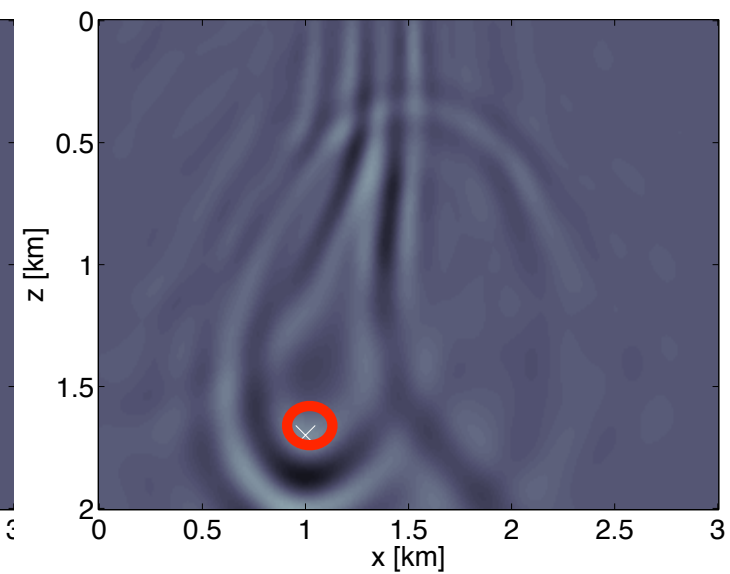
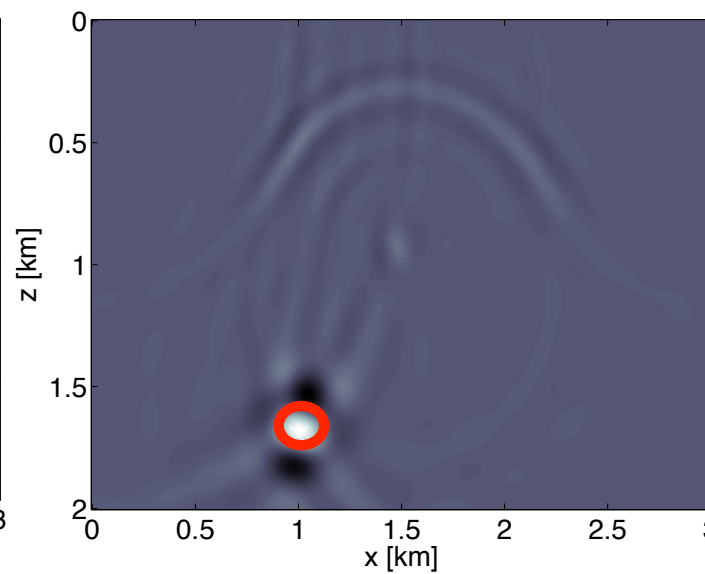
# Reflection tomography



# Reflection tomography



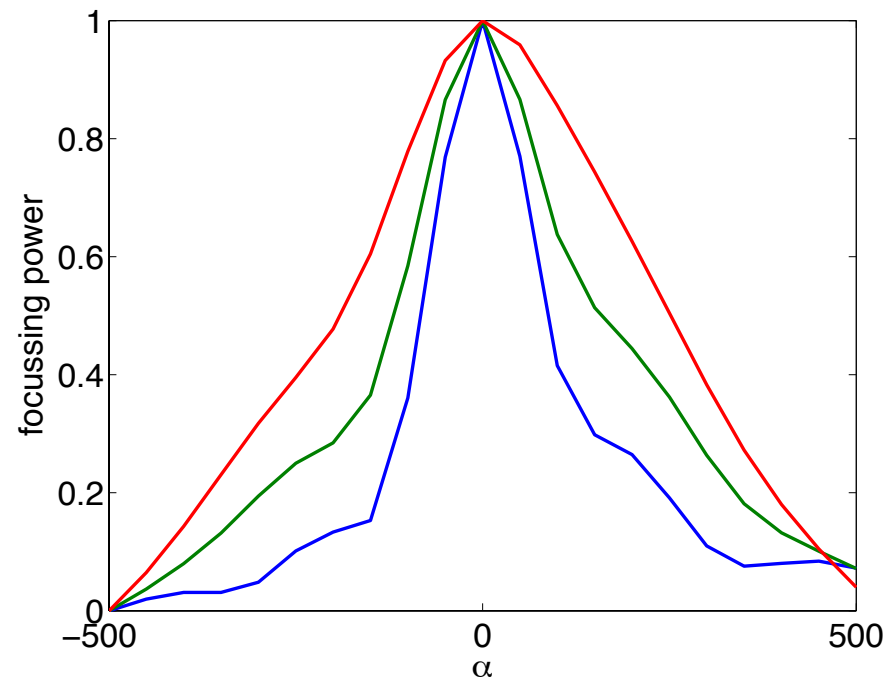
low velocity



high velocity

# Reflection tomography

focussing power for **small**, **medium** and **large** scale





## Conclusions & Future work

- Natural way to move from travelttime to amplitude fitting, and overcome loopskipping
- Multiscale WF detection might be extended to dispersion and stereo tomography
- Similar ideas might be applied in reflection case

# Acknowledgements

## The organizers



This work was in part financially supported by the Natural Sciences and Engineering Research Council of Canada Discovery Grant (22R81254) and the Collaborative Research and Development Grant DNOISE II (375142-08). This research was carried out as part of the SINBAD II project with support from the following organizations: BG Group, BP, Chevron, ConocoPhillips, Petrobras, Total SA, and WesternGeco.

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