

# **Generalized Cross Correlation: New Tools for Receiver and Source Array Processing**

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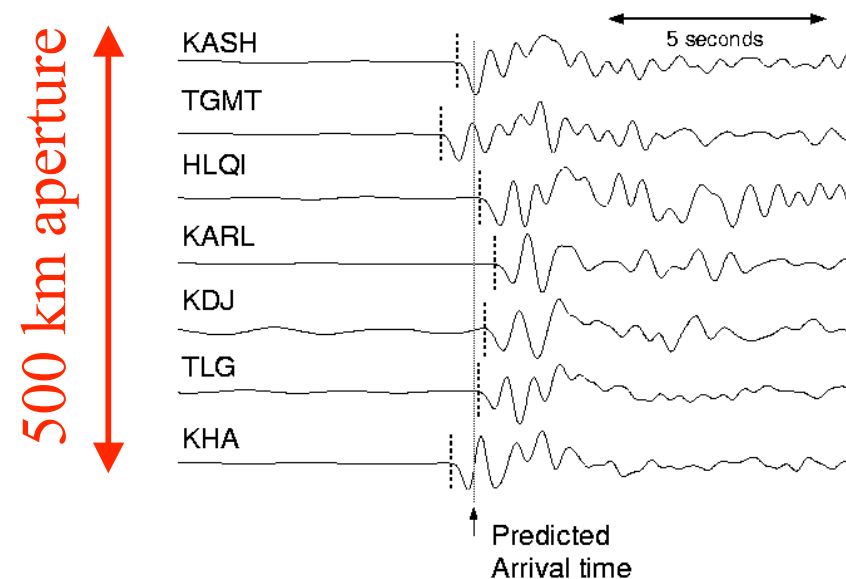
Frank Vernon, Univ. of Calif. San Diego

# Array Processing

- Historical focus colored by nuclear monitoring
  - Plane wave processing of small arrays
  - Signal enhancement of small events
  - High frequency vertical instruments
- Modern challenge
  - Broadband instruments
  - Three-component instruments universal
  - Large aperture arrays (USArray)

# Problem 1: Alignment

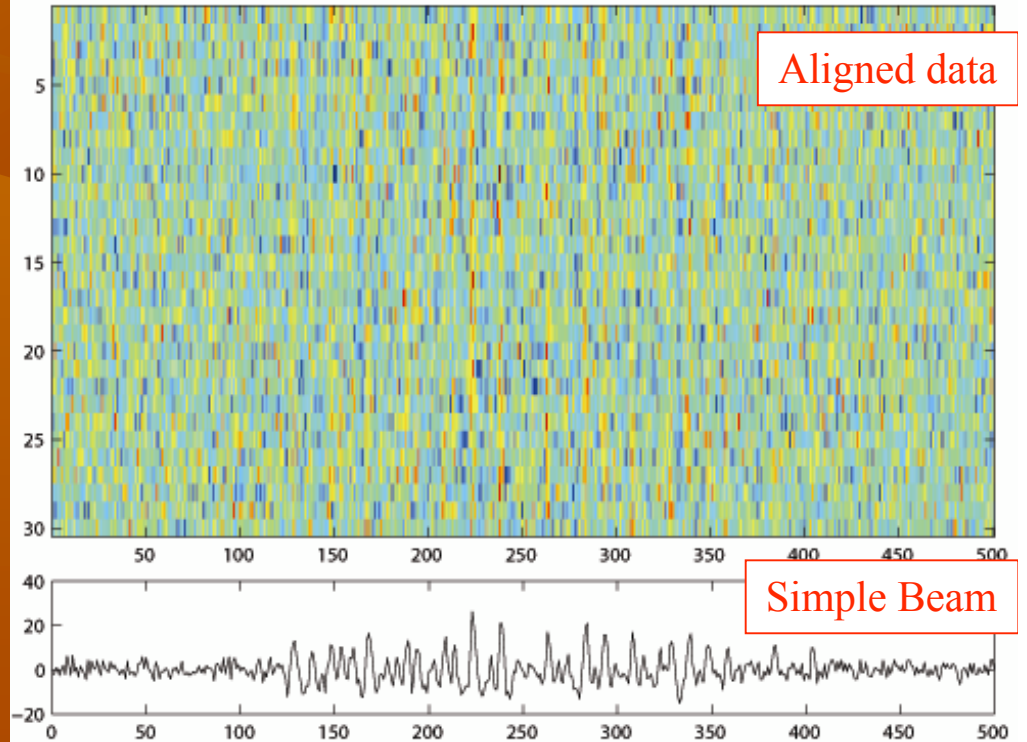
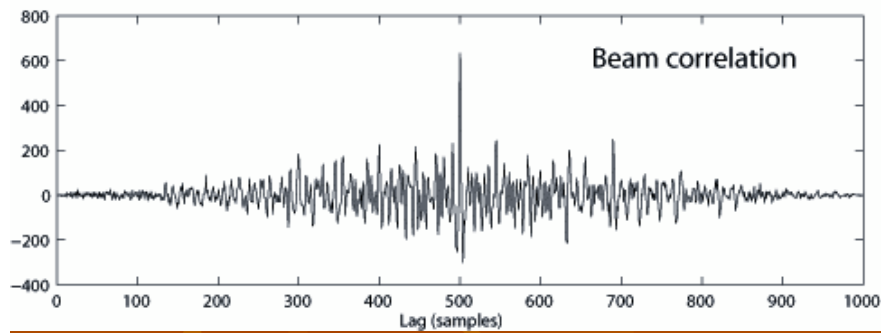
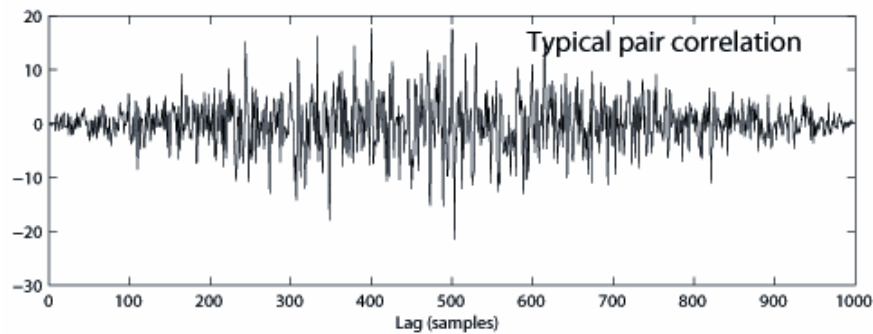
- Plane wave approximation fails when aperture gets large
- Conversely data are coherent over distances of more than 1000 km
- For large arrays stacks do not align
- Alignment lags = residuals for body wave tomography



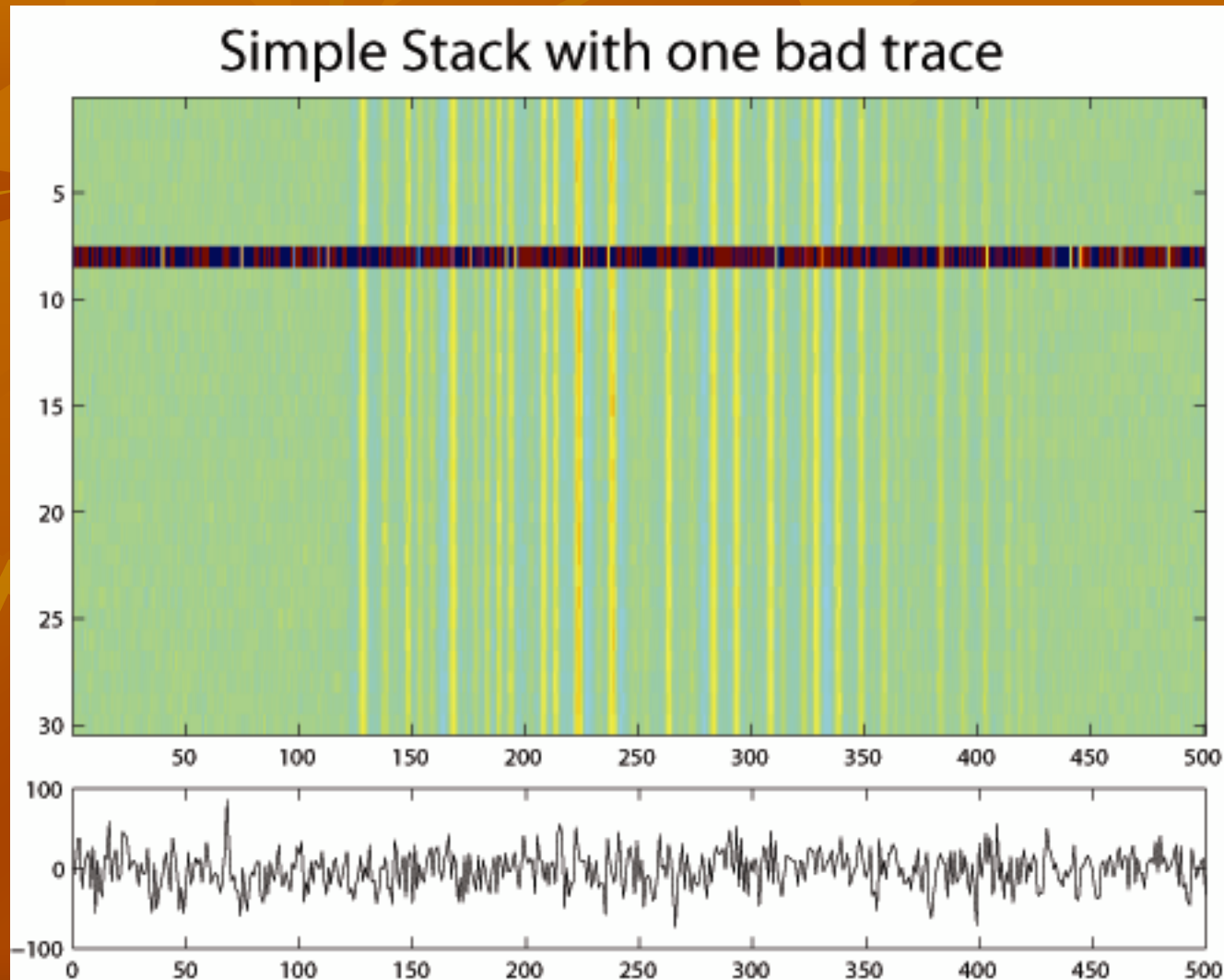
# Solution?

- Pair-wise correlation
  - Commonly used for P and S wave tomography residual measurements (VandeCarr and Crosson, 1990)
  - Commonly used for “source array” (Shearer and others)
- Beam correlation – obscure capability of dbap

# We strongly prefer beam correlation for reason seen here

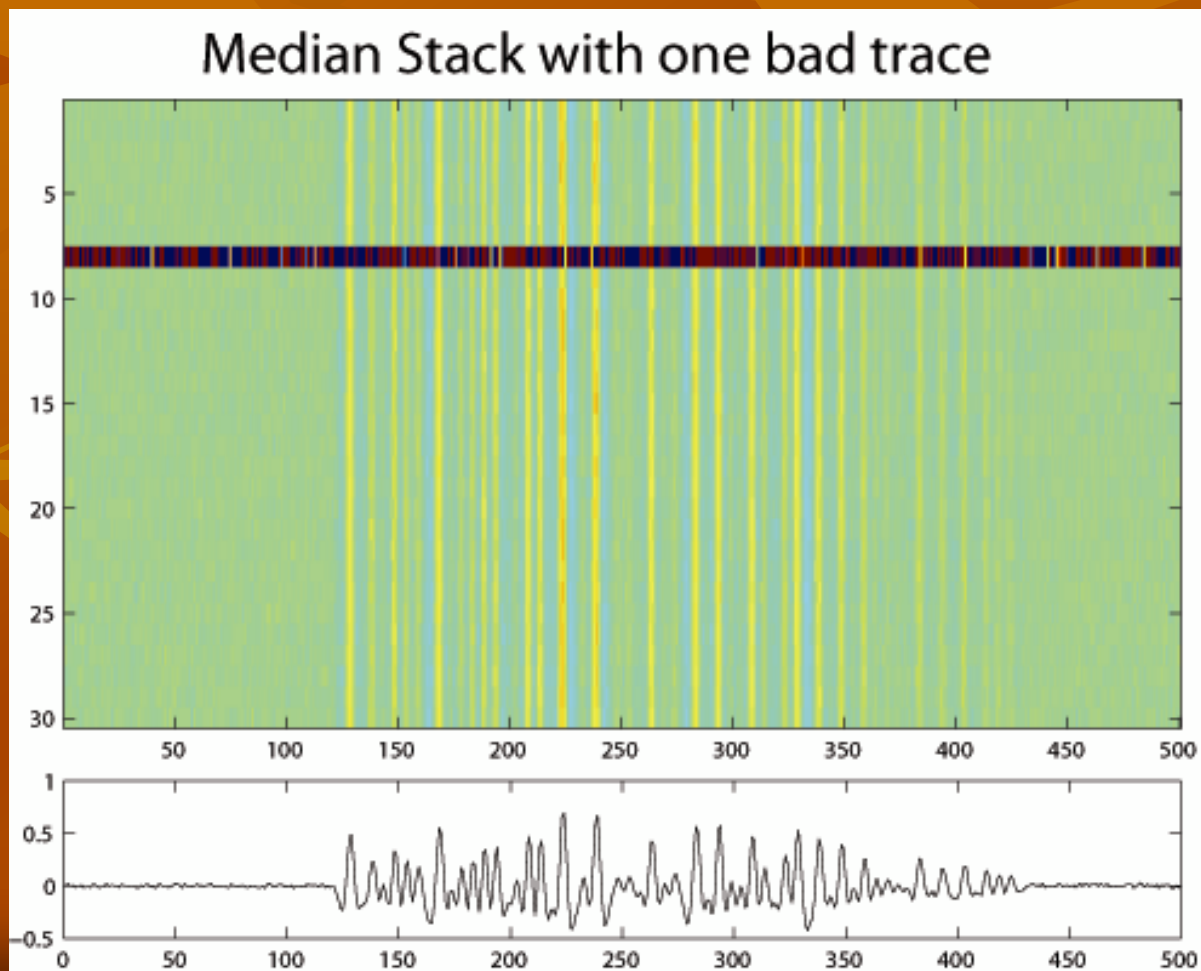


# Problem 2: Bad channels



# Solution

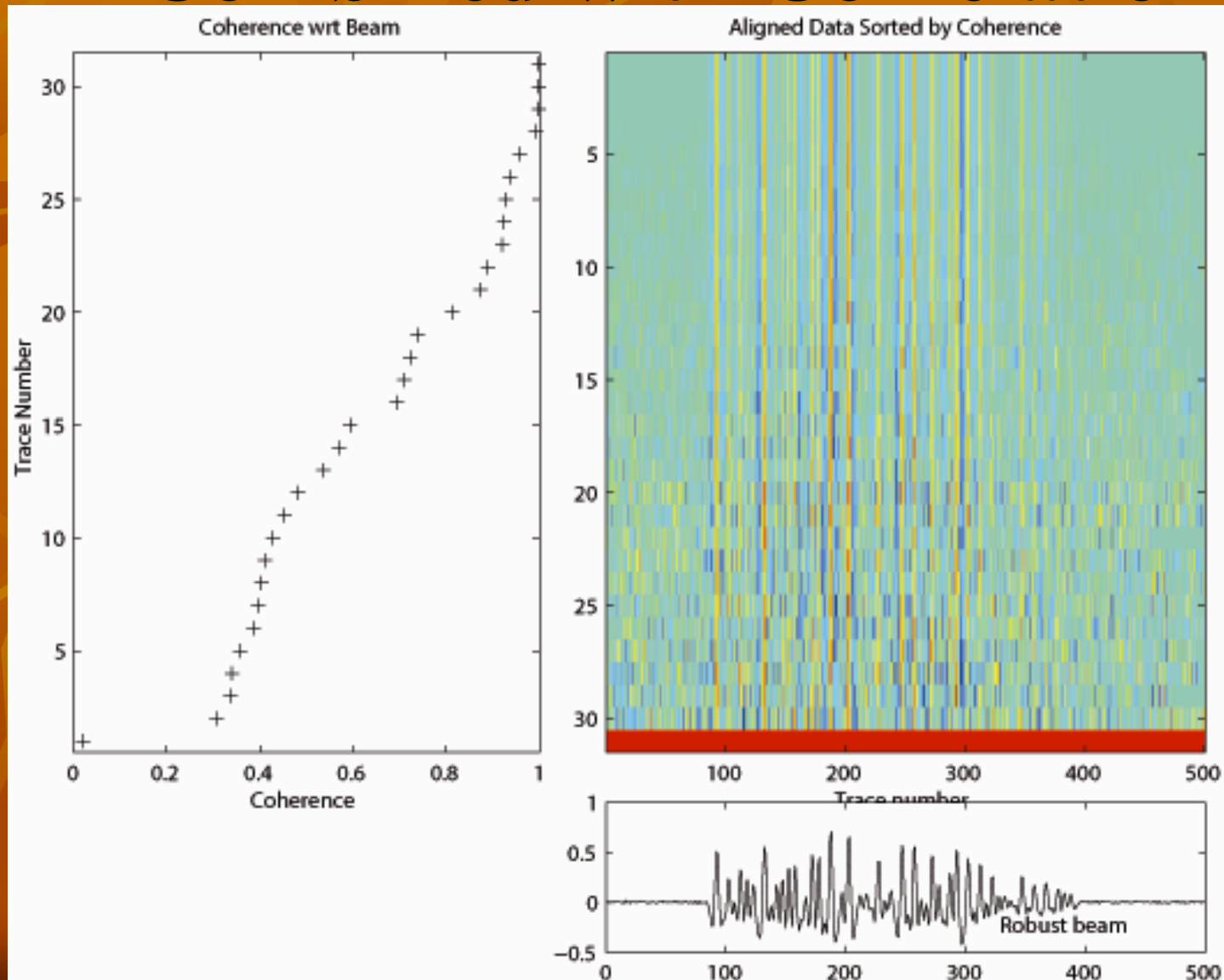
- Robust stack algorithm





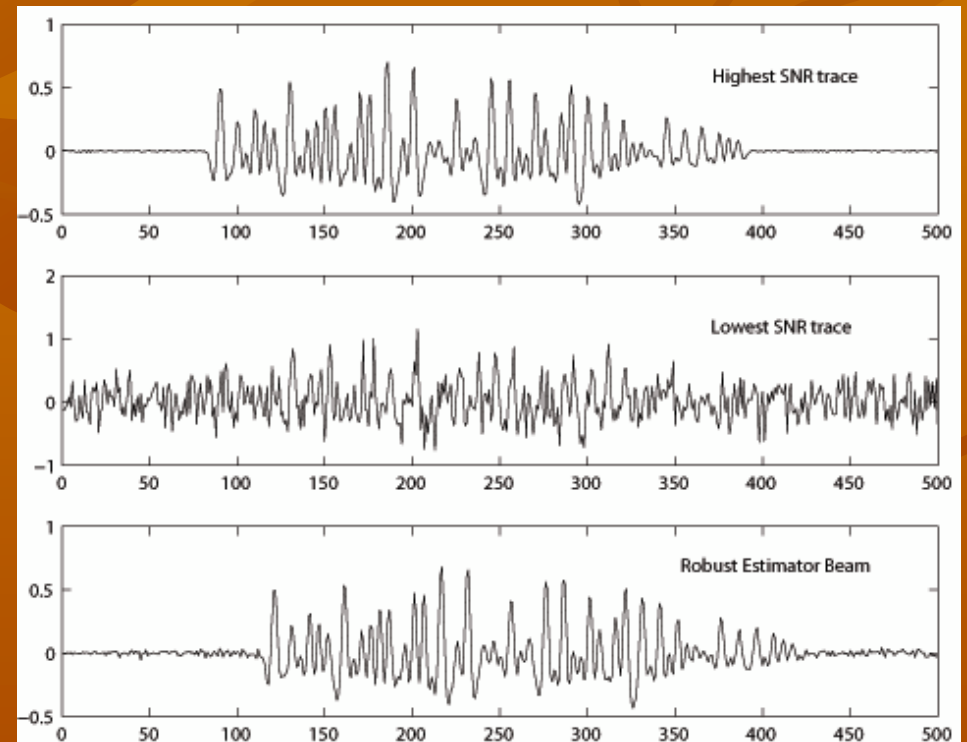


# Solution: Robust stacking Combined with Correlation



# Motivation for Methodology

- “Hot” station is common with real data
- Want marginal data to contribute, but not degrade beam SNR
- Want to automatically discard bad data



# Robust Method

- Initialize beam with pick of best station
- Initial alignment by cross-correlation
- Median stack
- Repeat until convergence:
  - 📁 Foreach ensemble member
    - 📁 Residual=data – current\_beam
    - 📁 Weight(i) = penalty\_function(residual);
  - 📁 current\_beam = weighted stack
  - 📁 Realign data by cross-correlation with beam

# Penalty Function

Amplitude  
Normalization

$$w_i = \frac{\mathbf{d}_i \bullet \mathbf{b}}{\|\mathbf{d}_i\| \|\mathbf{r}_i\|} = \frac{\mathbf{d}_i \bullet \mathbf{b}}{\|\mathbf{d}_i\| \|\mathbf{d}_i - (\mathbf{d}_i \bullet \mathbf{b})\mathbf{b}\|}$$

where

Controlled by Signal to Noise AND coherence

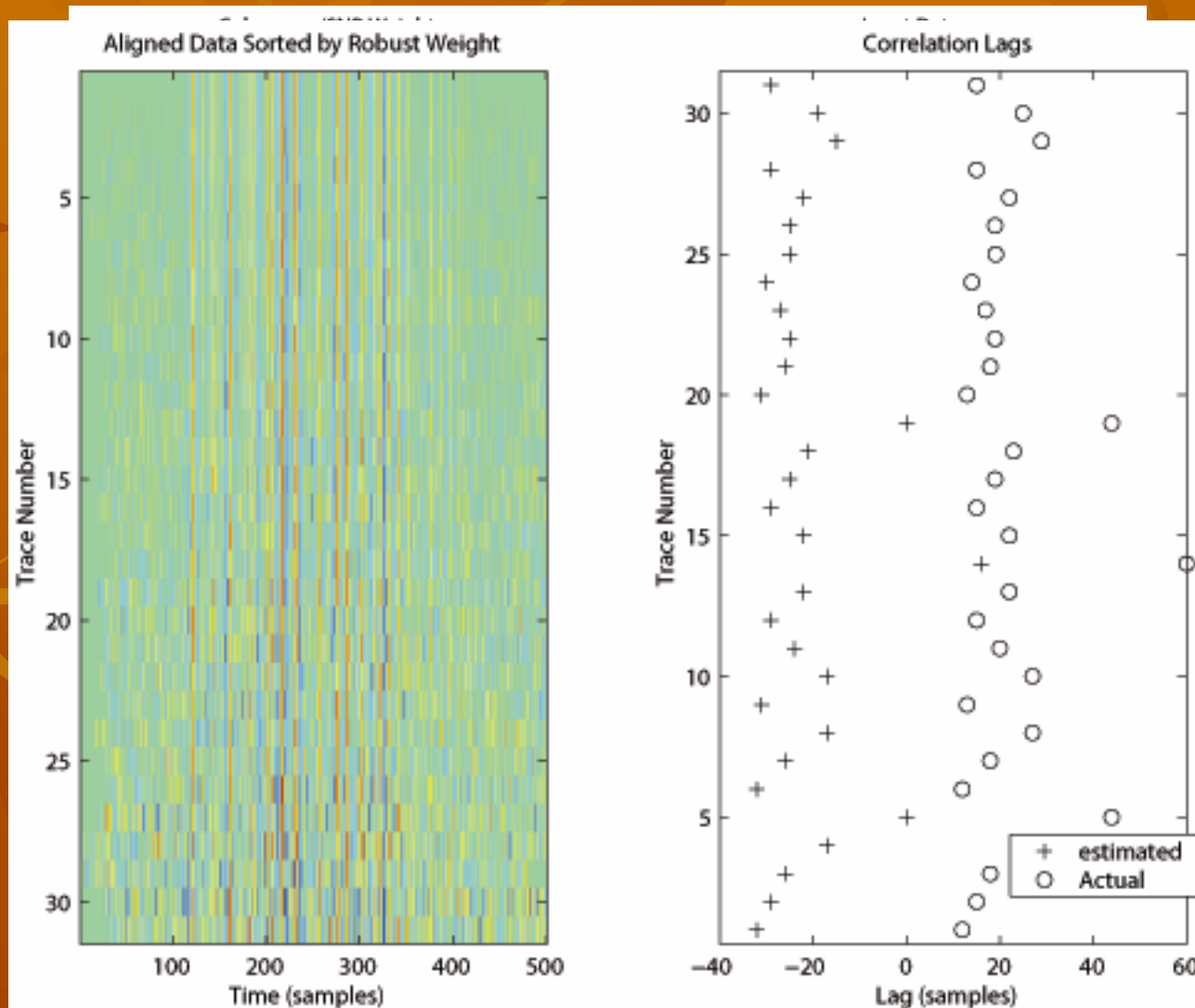
$w_i$  is the robust weight computed for the  $i^{th}$  seismogram,

$\mathbf{d}_i$  is the  $i^{th}$  seismogram in the ensemble,

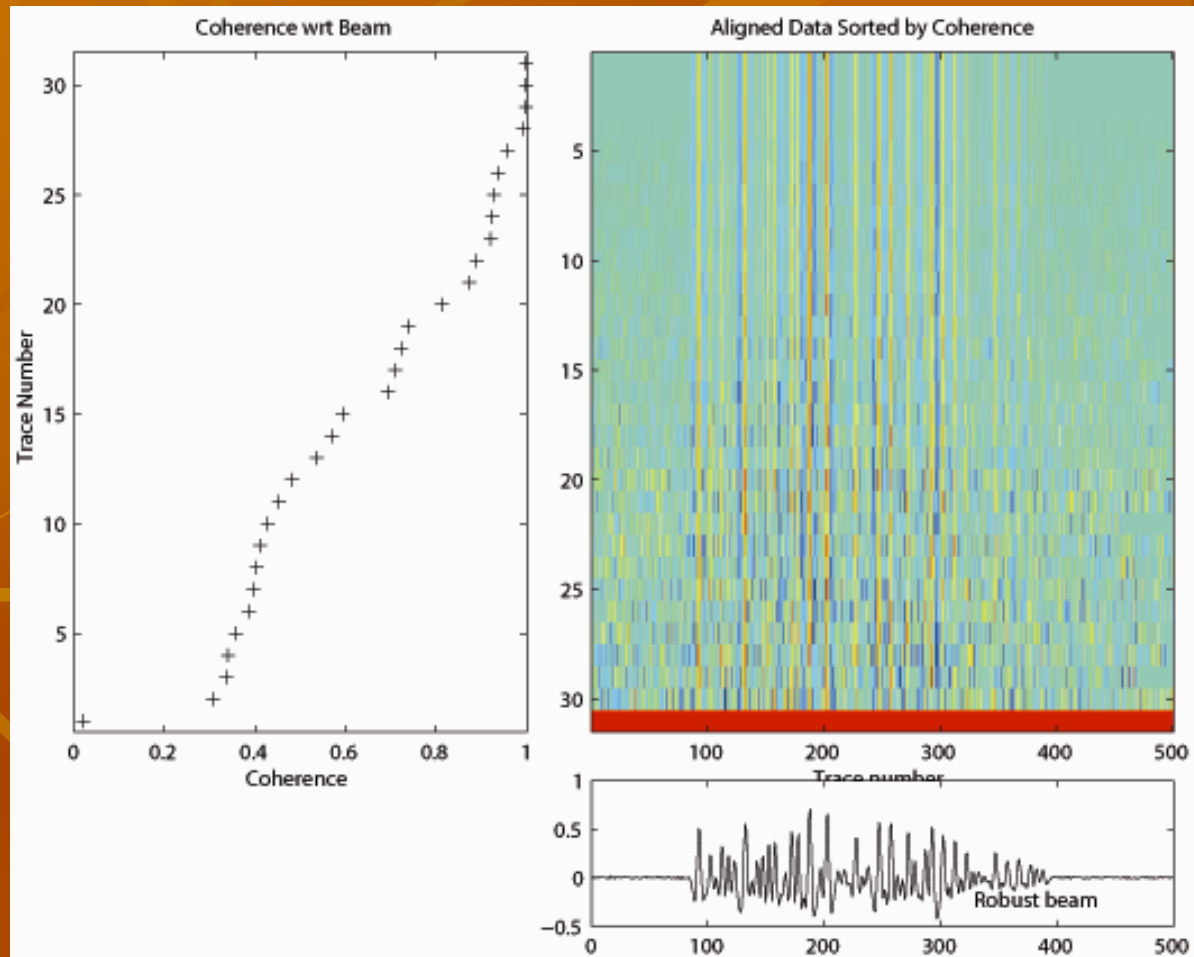
$\mathbf{b}$  is the normalized beam (i.e.  $\|\mathbf{b}\| = 1$ ) and,

$\mathbf{r}_i$  is the residual seismogram.

# Synthetic Example 1



# Synthetic Example 2: one dead trace



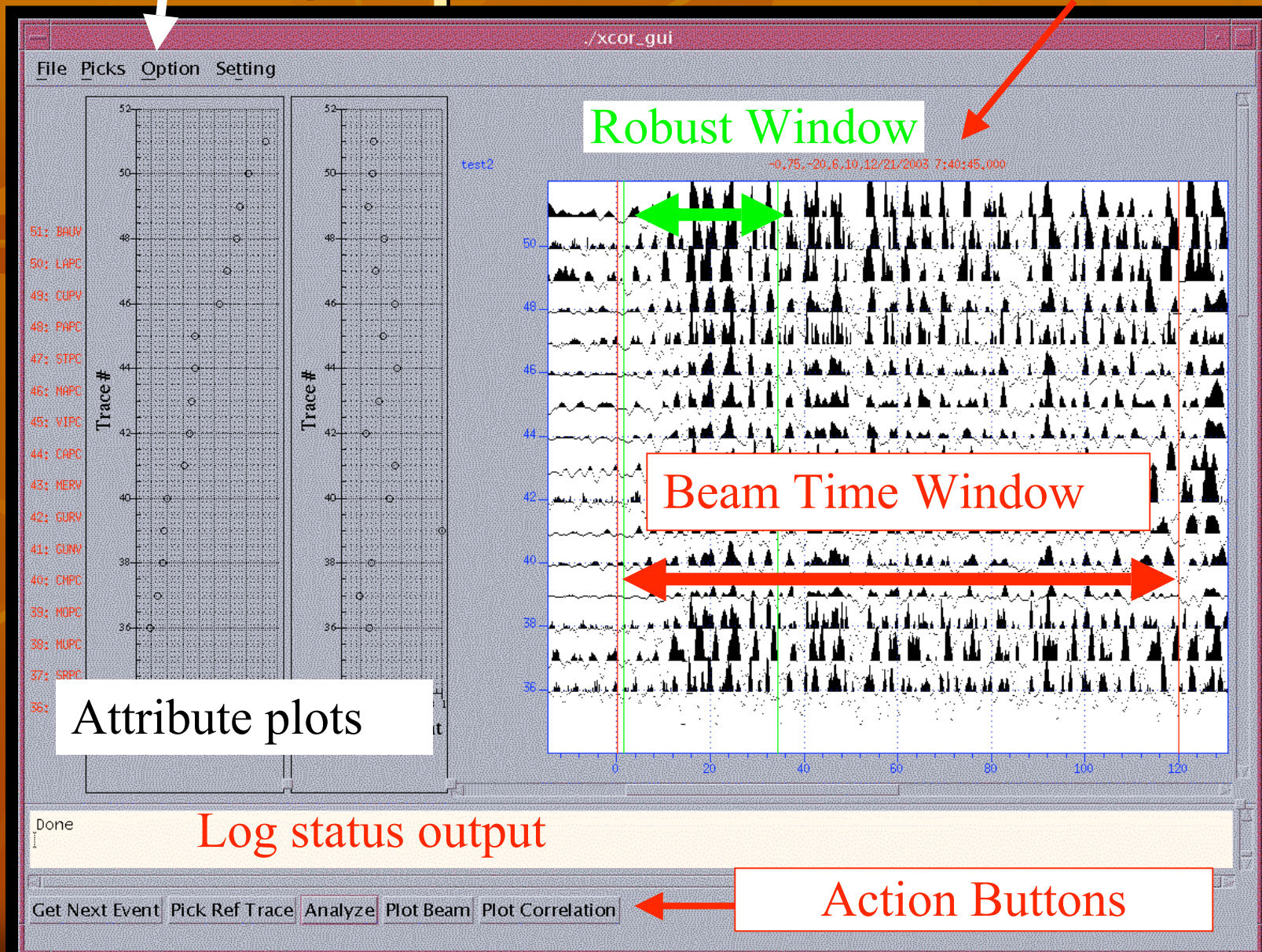
# New Implementation

- X Windows (Motif) graphical user interface written by Peng Wang
  - Developed Seismic Plot Widget
  - Trace plot from Seismic Unix (SU)
  - Used open-source tool to do an attribute display
  - Picking abstracted as SeismicPick object
- Analysis code
  - C++ processing object called a “MultichannelCorrelator”
  - Implements algorithm I just described
  - Could be equally applied to source array ensemble, but new program is focused on teleseismic phase picking

Option menus

# Graphical Interf

Event information



Robust Window

Beam Time Window

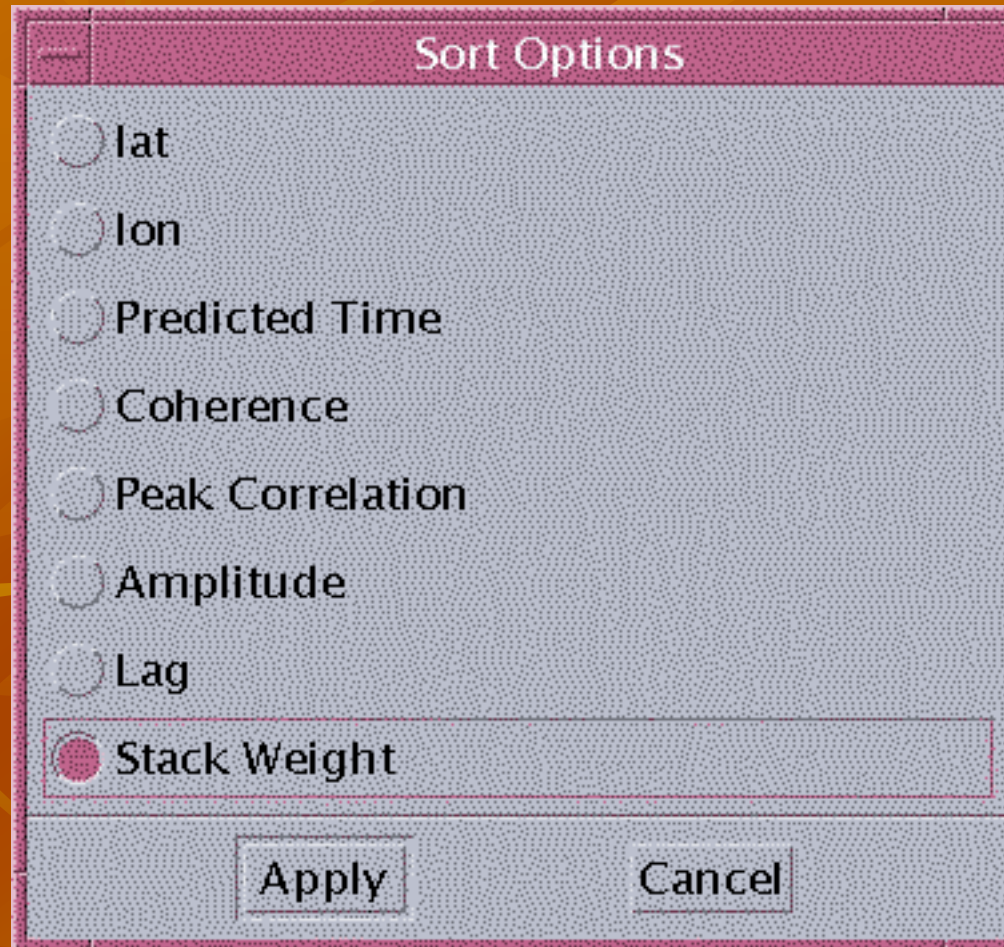
Attribute plots

Log status output

Action Buttons



# Sort Options



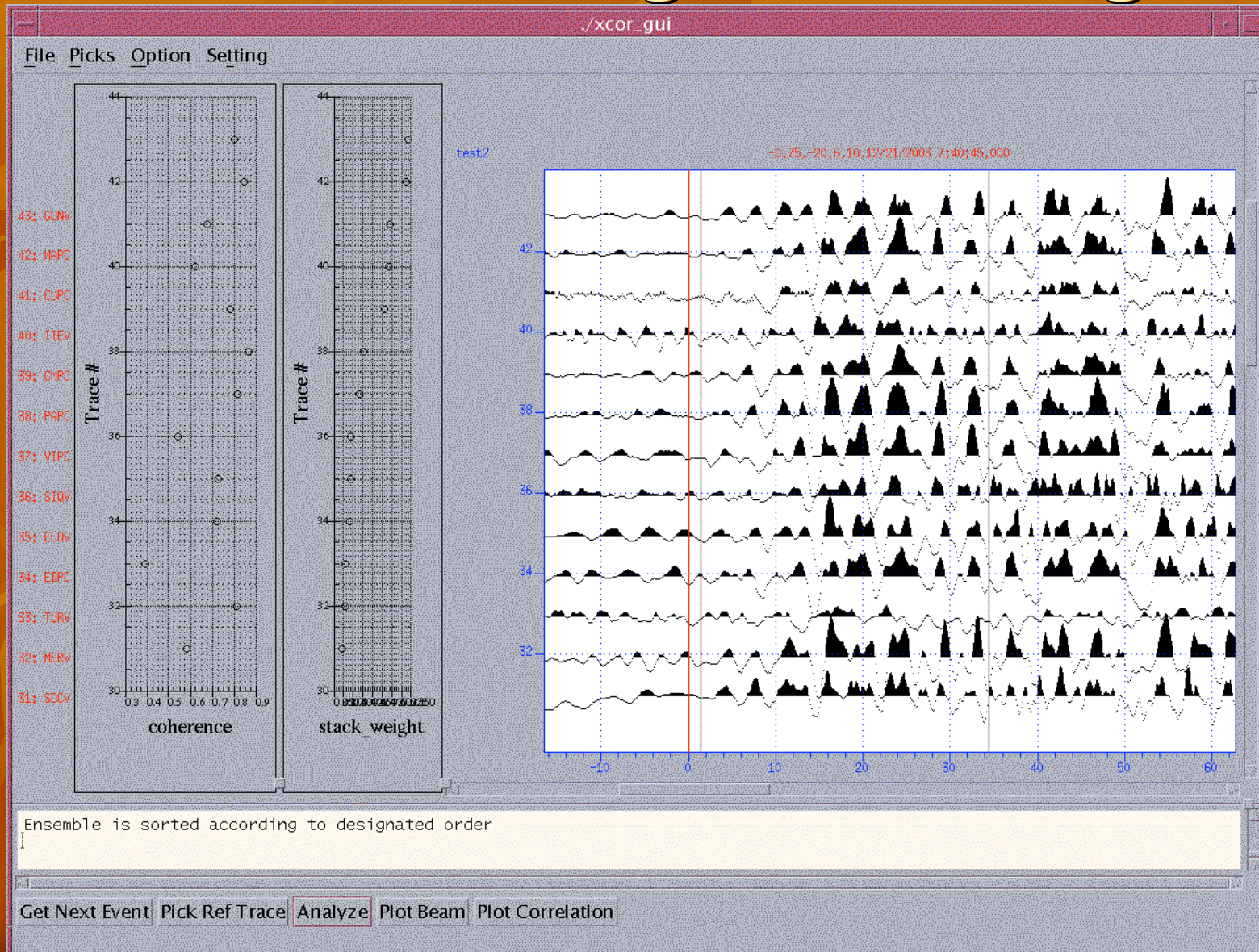
A dialog box titled "Sort Options" with a light blue background and a pink border. It contains a list of eight radio button options. The "Stack Weight" option is selected, indicated by a pink dot in the radio button. At the bottom of the dialog are two buttons: "Apply" and "Cancel".

Sort Options

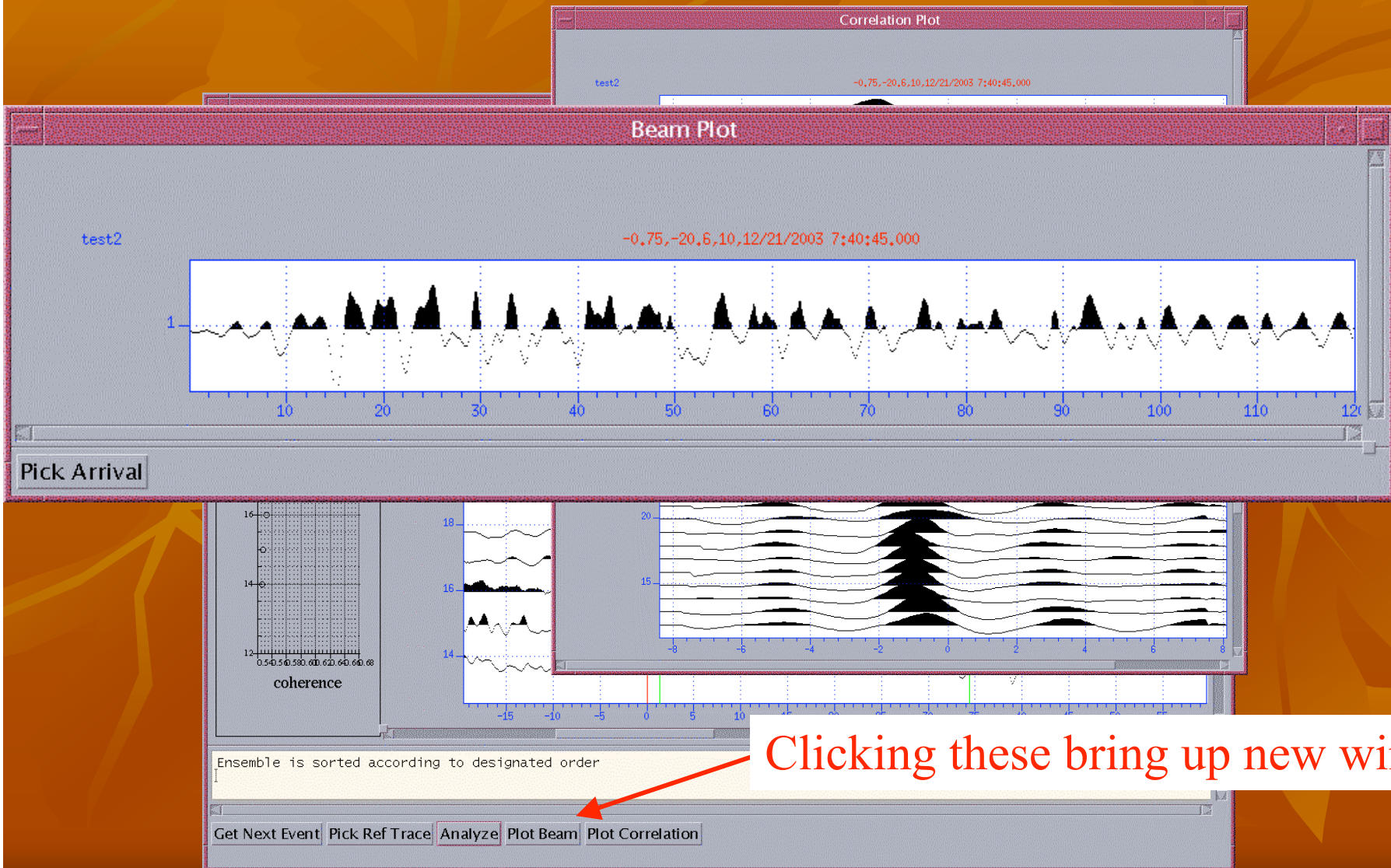
- lat
- lon
- Predicted Time
- Coherence
- Peak Correlation
- Amplitude
- Lag
- Stack Weight

Apply Cancel

# Result of selecting “Stack Weight”

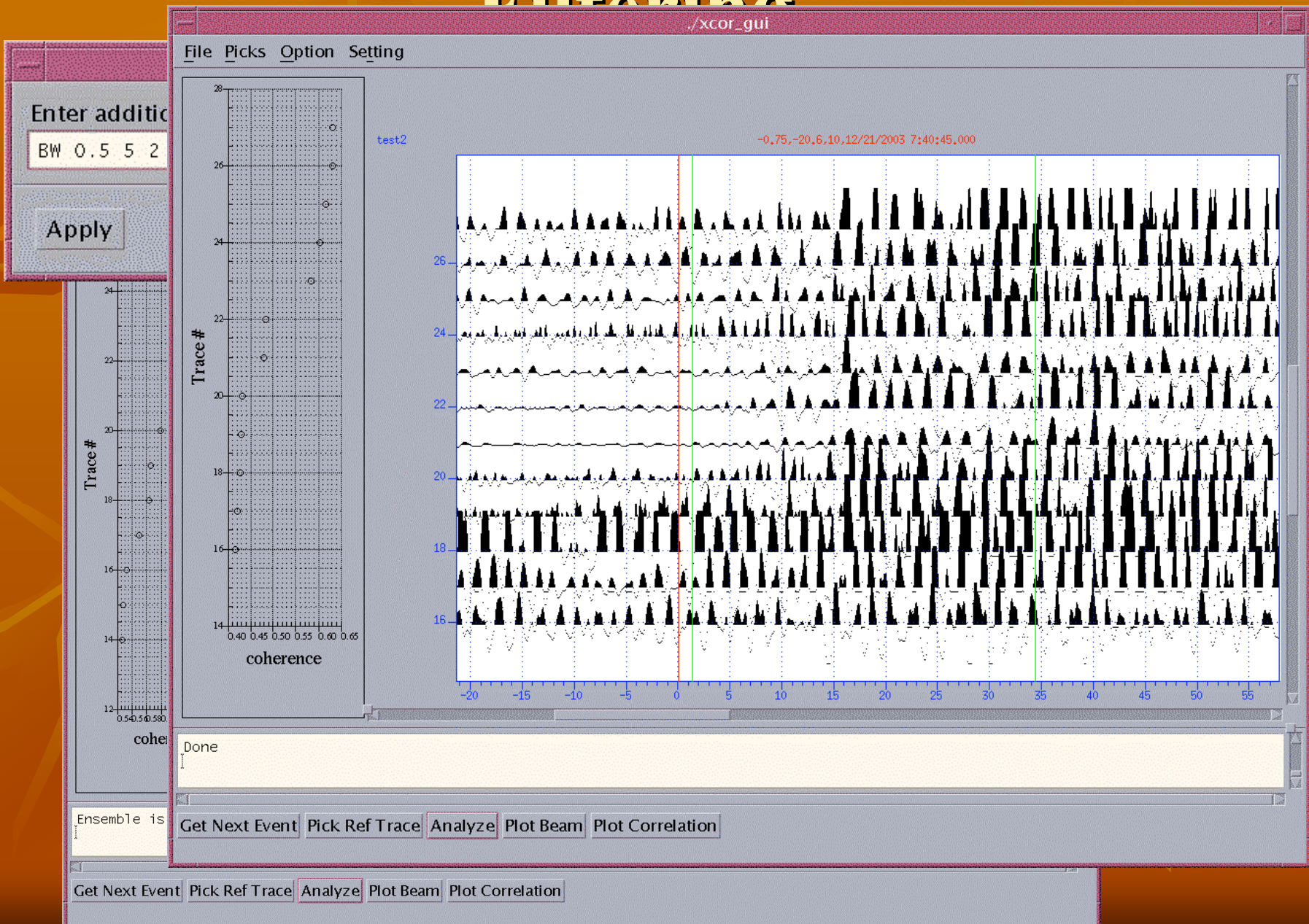


# Beam and Correlation plots



Clicking these bring up new window

# Filtering



# Extension to Three-components

Three-component correlations:

$$\mathbf{c}_1 = \mathbf{e} \otimes \mathbf{b}_e$$

$$\mathbf{c}_2 = \mathbf{n} \otimes \mathbf{b}_n$$

$$\mathbf{c}_3 = \mathbf{v} \otimes \mathbf{b}_v$$

Combined to give vector correlation:

$$\|\mathbf{c}(\tau)\| = |\mathbf{c}_1| + |\mathbf{c}_2| + |\mathbf{c}_3|$$

This is a generalization of complex form:

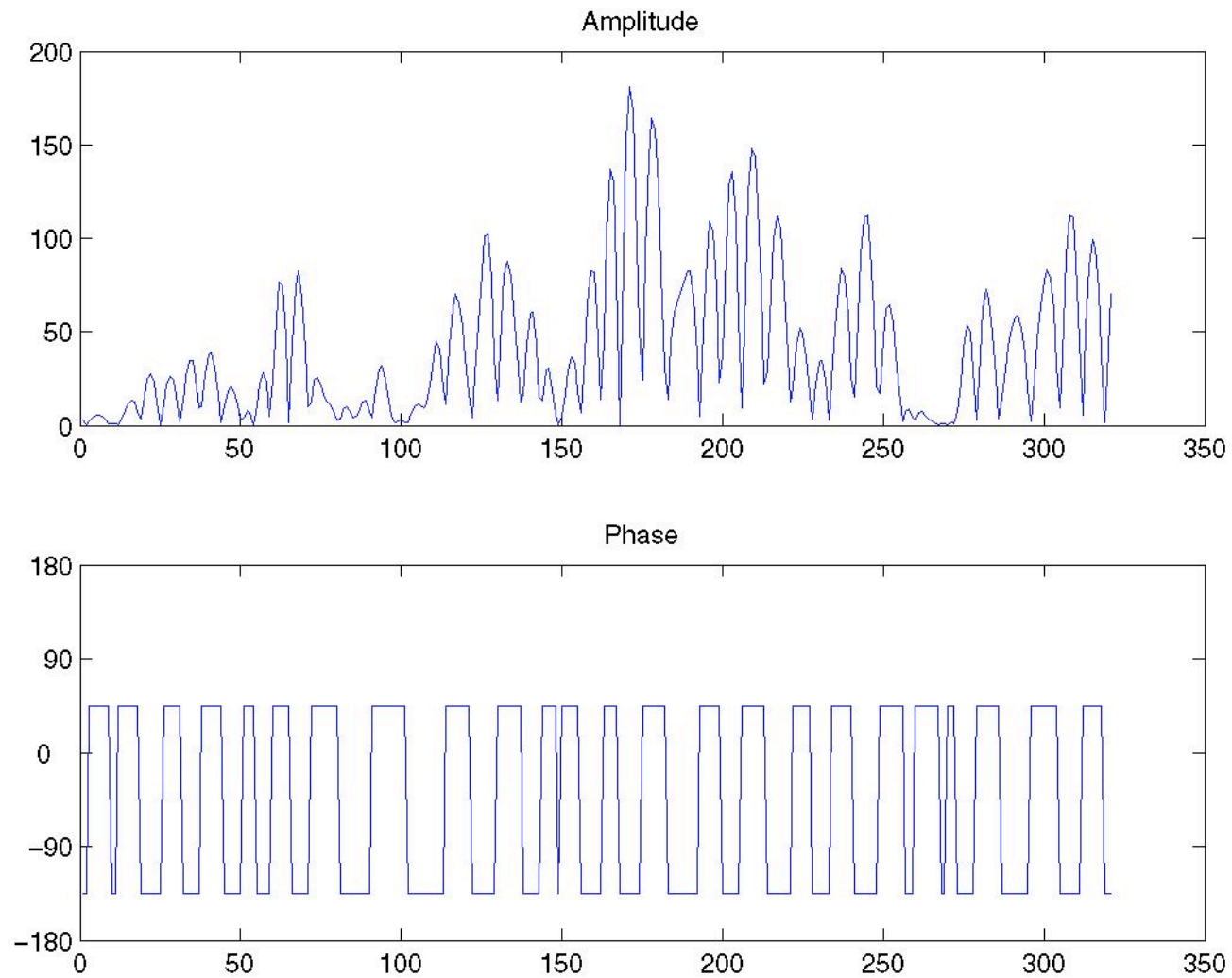
$$\mathbf{z}(t) = \mathbf{e}(t) + i\mathbf{n}(t)$$

where the complex cross-correlation function is

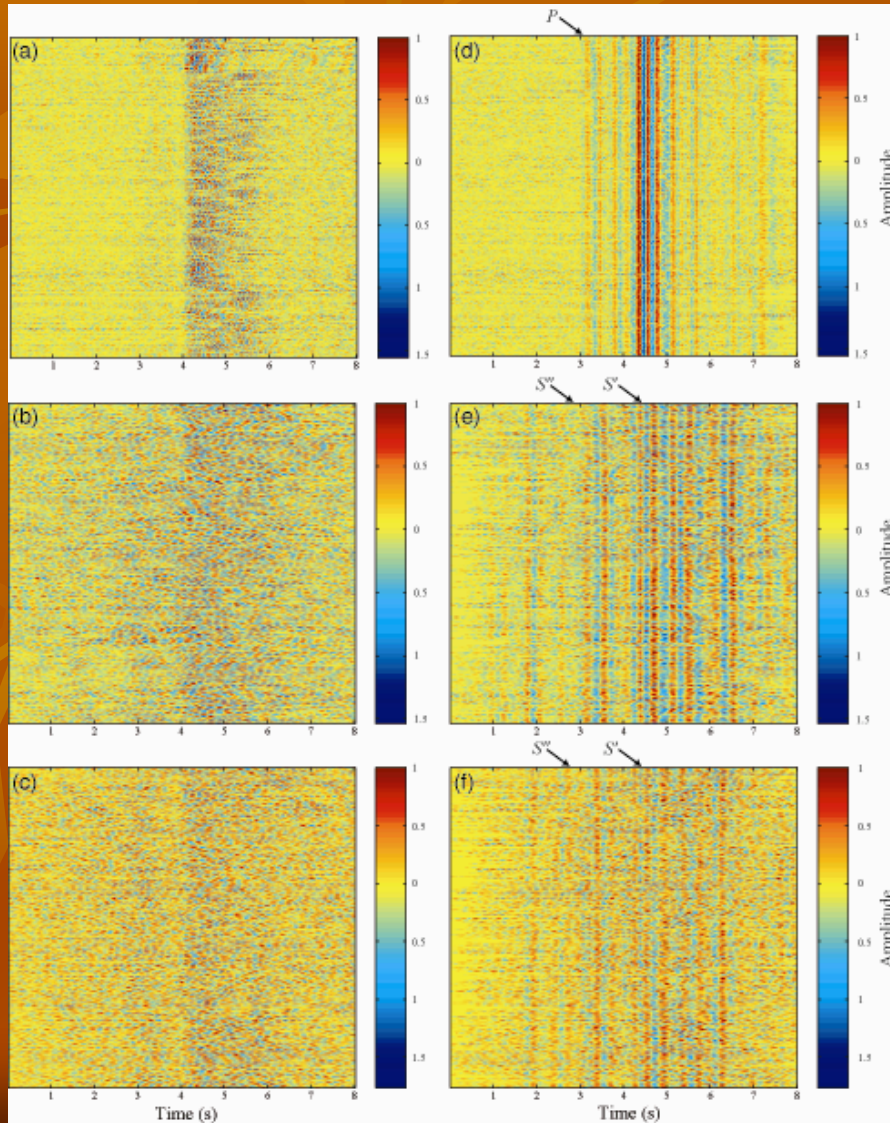
$$\mathbf{c}(\tau) = \mathbf{z} \otimes \mathbf{b}_z$$

Both amplitude and phase of  $\mathbf{c}(\tau)$  are potentially useful

# Example: Eagar (2005)



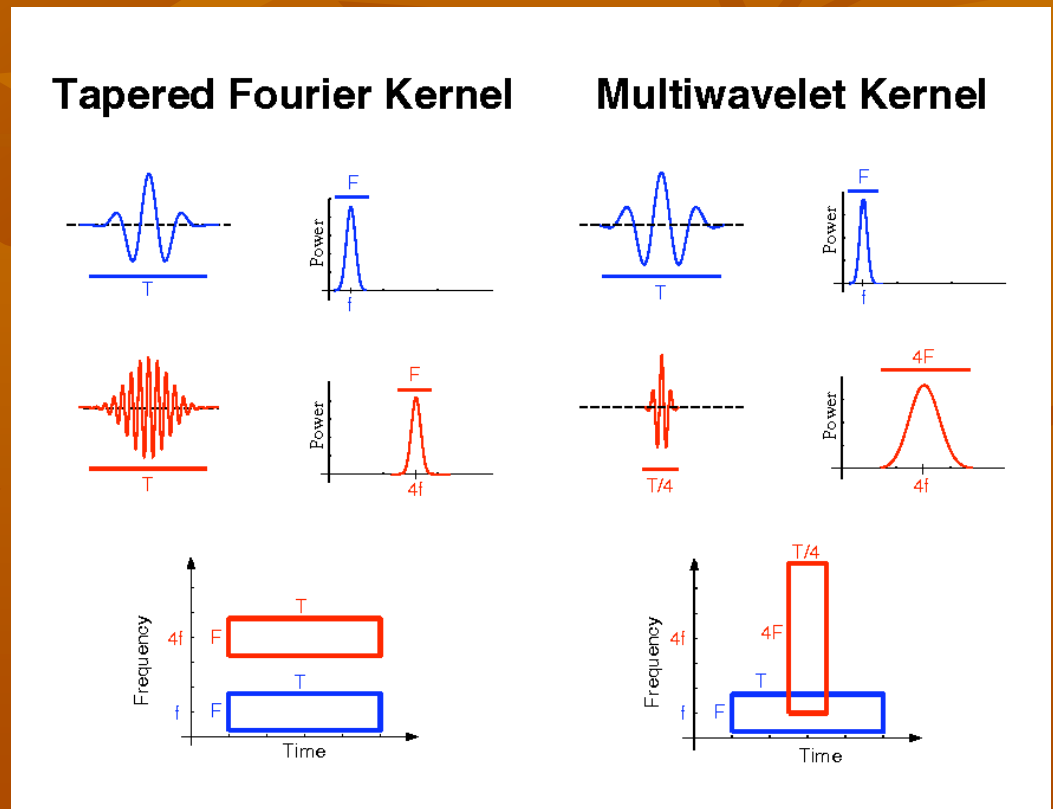
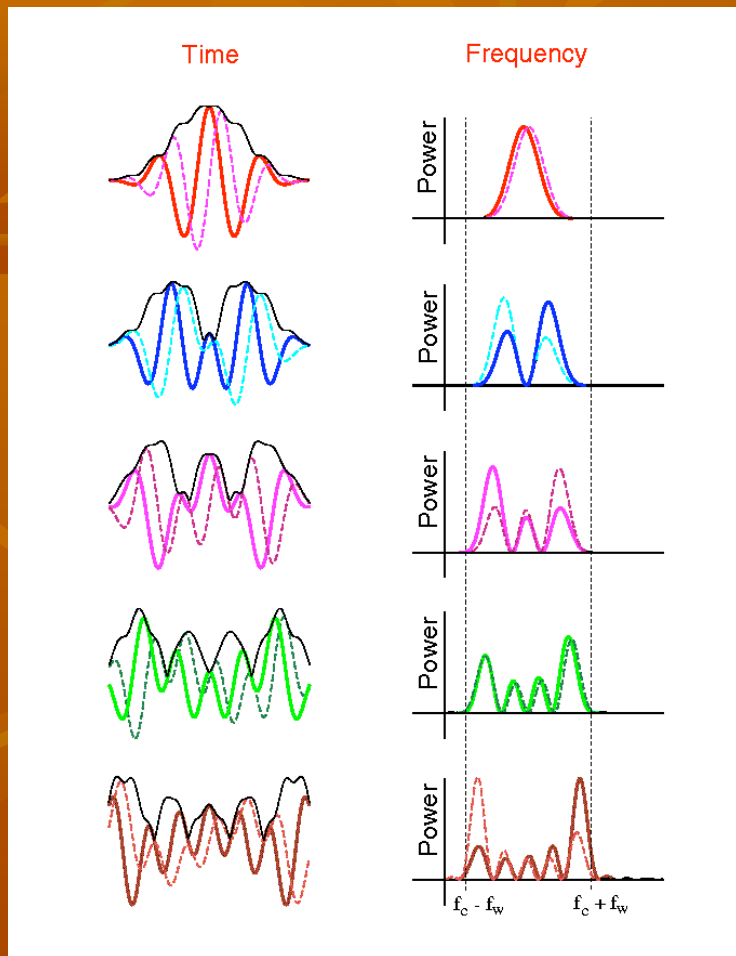
# Application to source array: (Eagar, 2005)



Vertical – robust single  
Channel algorithm

EW and NS – complex  
correlation algorithm

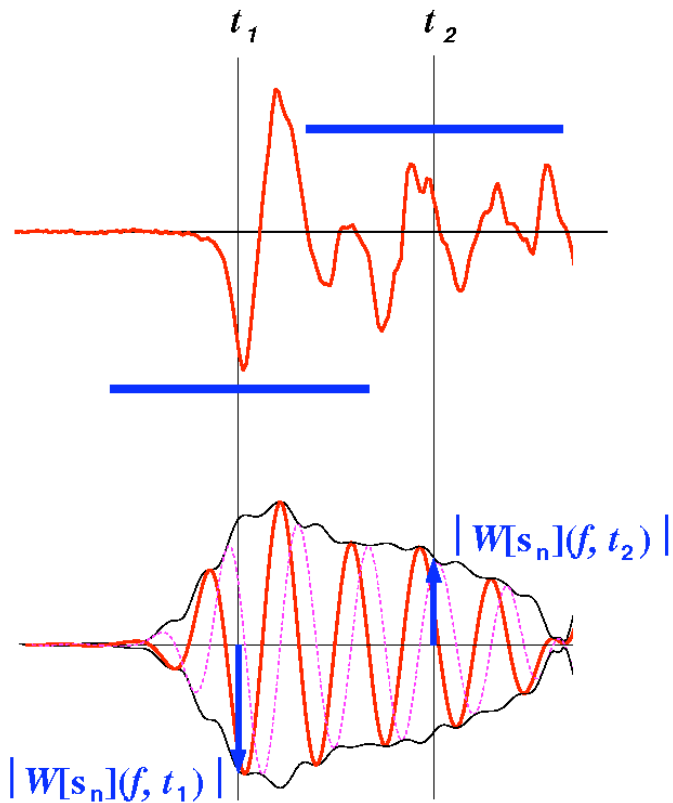
# Multiwavelets



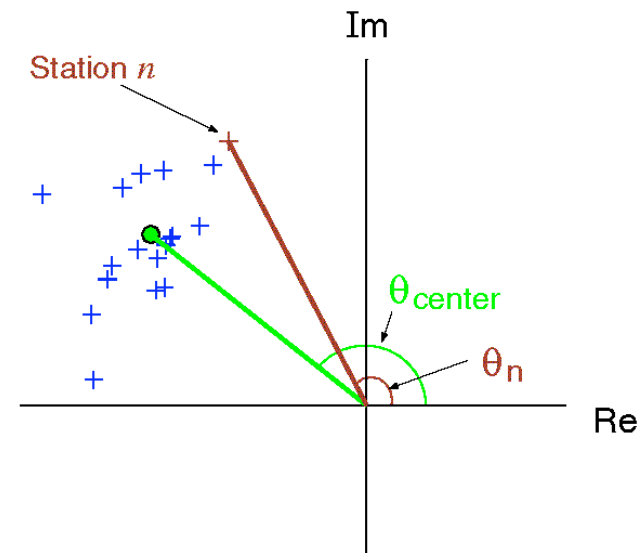


# Advantage 1: subsample timing by phase measurement

Wavelet transformed / Complex filtered



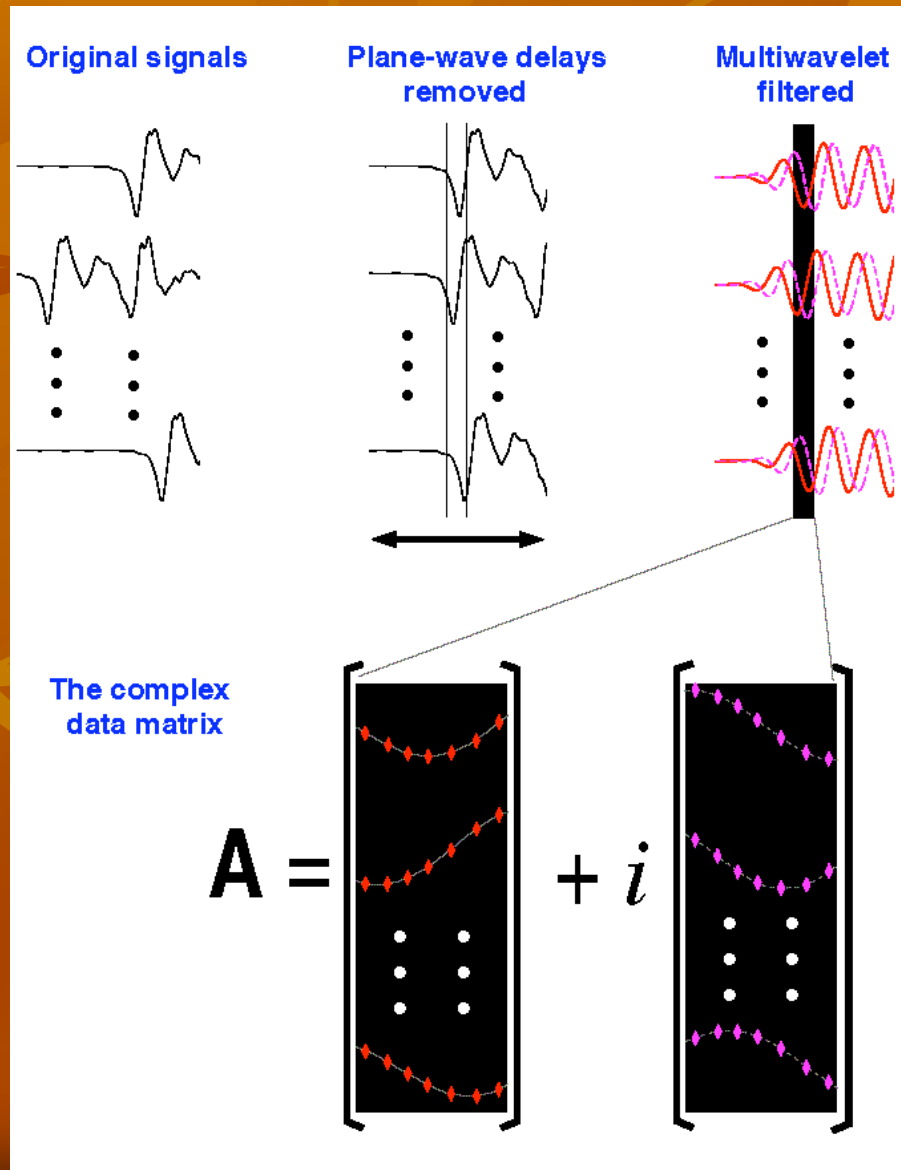
Plot of principal component values from complex matrix A



$$e^{i(\theta_n - \theta_{center})} = e^{i2\pi f \tau(n)}$$

Time residual

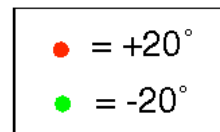
# Multiwavelet Array Processing



Bear and Pavlis (1999)

# Advantage 2: Simultaneous particle motion estimation

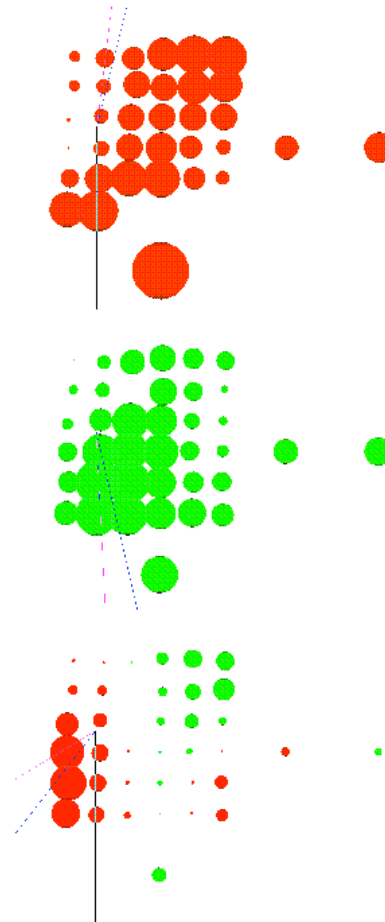
## Minor Axis Tilts



$\theta_{loc} = 7^\circ$

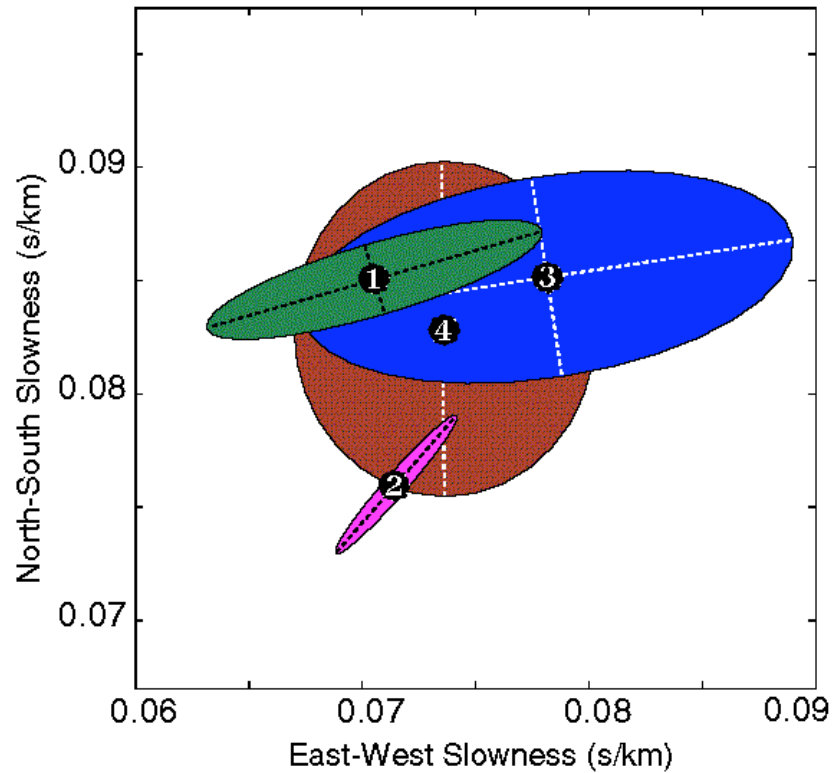
$\theta_{loc} = 177^\circ$

$\theta_{loc} = 239^\circ$



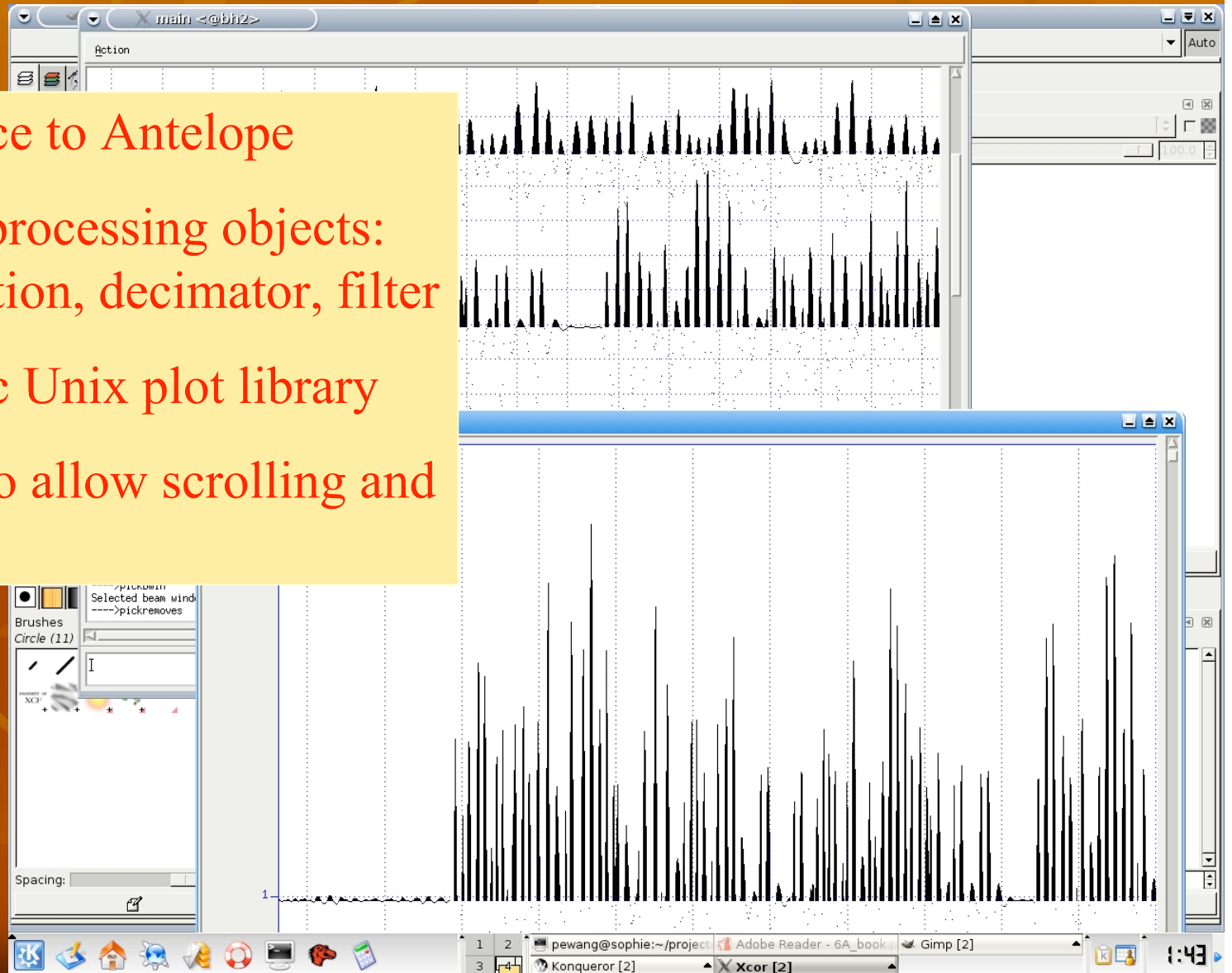
Bear et al. (1999)

# Advantage 3: Nonparametric Error Estimates



# Implementation

- C++ interface to Antelope
- Interface to processing objects: stack, correlation, decimator, filter
- Uses Seismic Unix plot library
- Uses Motif to allow scrolling and picking



# Conclusions

- Beam correlation will always yield superior results to pairwise correlation
- Robust method
  - Robust stack using SNR/coherence-based loss function
  - Stable in presence of bad traces
  - Performs well in variable noise conditions
  - Iterative loop with beam correlation
- Three-component processing
  - Robust method penalizing each component separately
  - Complex method for horizontals only useful for orientation problems
  - Full 3C method
- Multiwavelet processing
  - Simultaneously measure slowness vector, lags, and polarization in multiple frequency bands
  - Only method known that can produce objective error estimates of above
- Code in C/C++ available at <http://www.indiana.edu/~aug> (Contributed Software link)