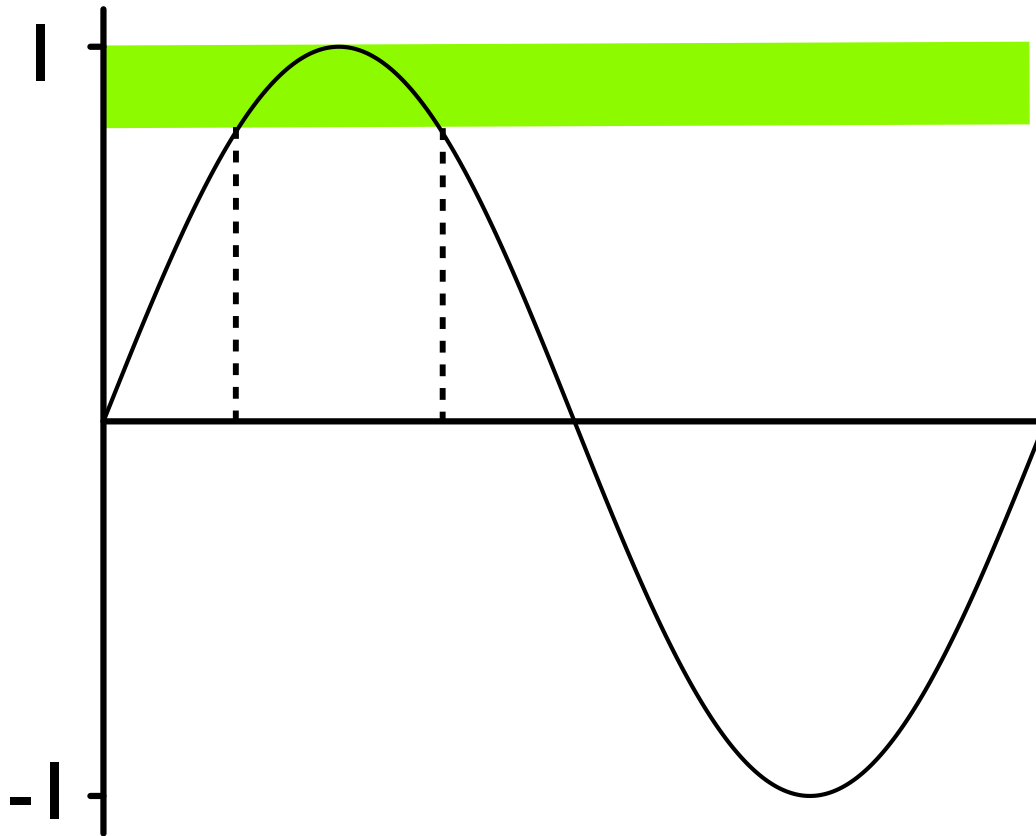


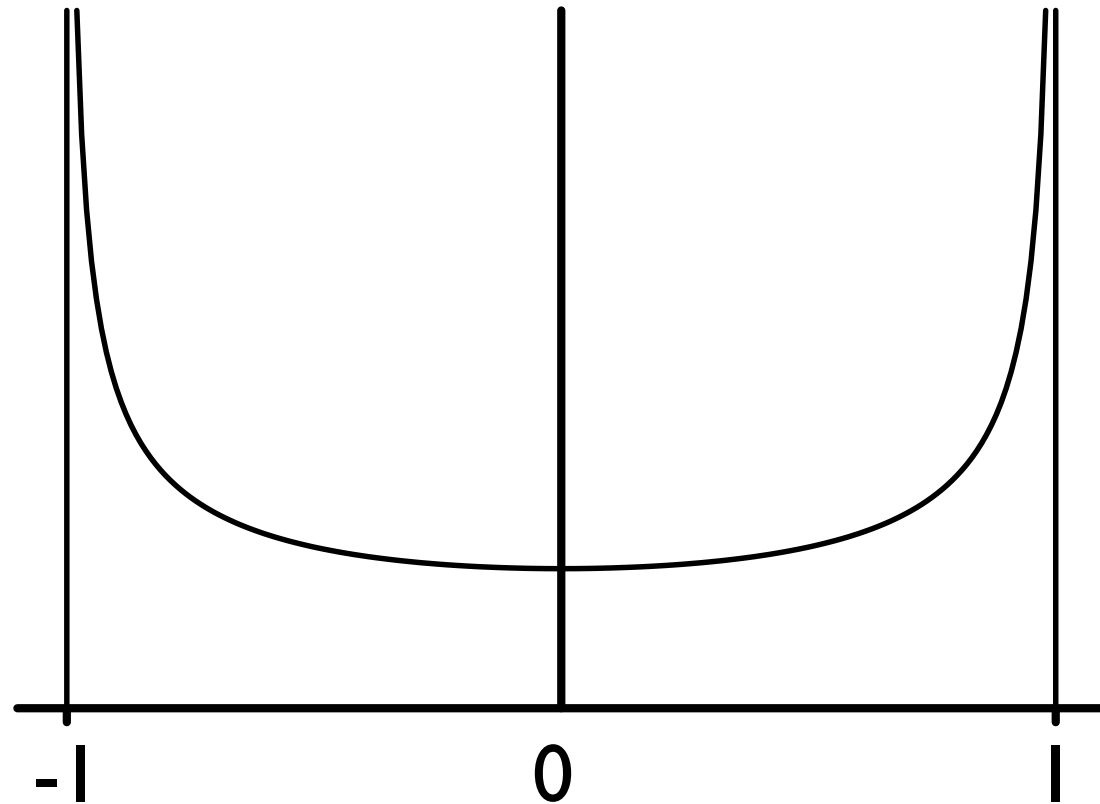
Using noise for tomography

Noise, cross correlation,  
phase velocities, and tomography

a sine wave

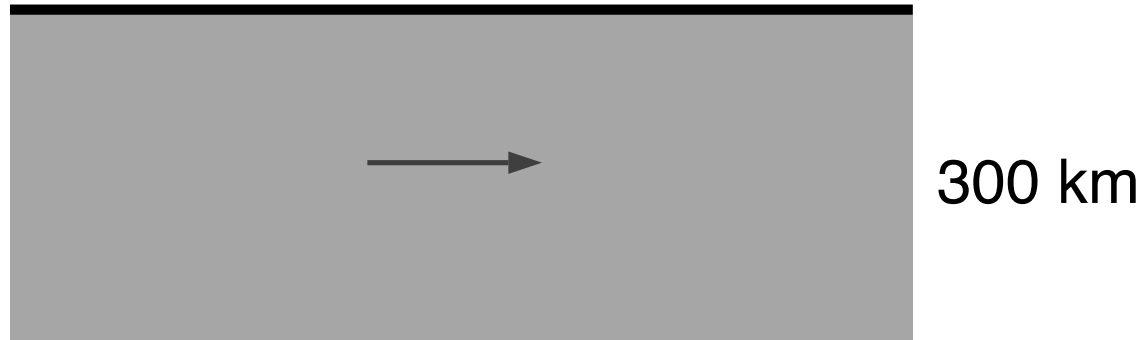


probability density function for a sine wave



# Sensitivity of surface wave velocities to elastic structure at depth

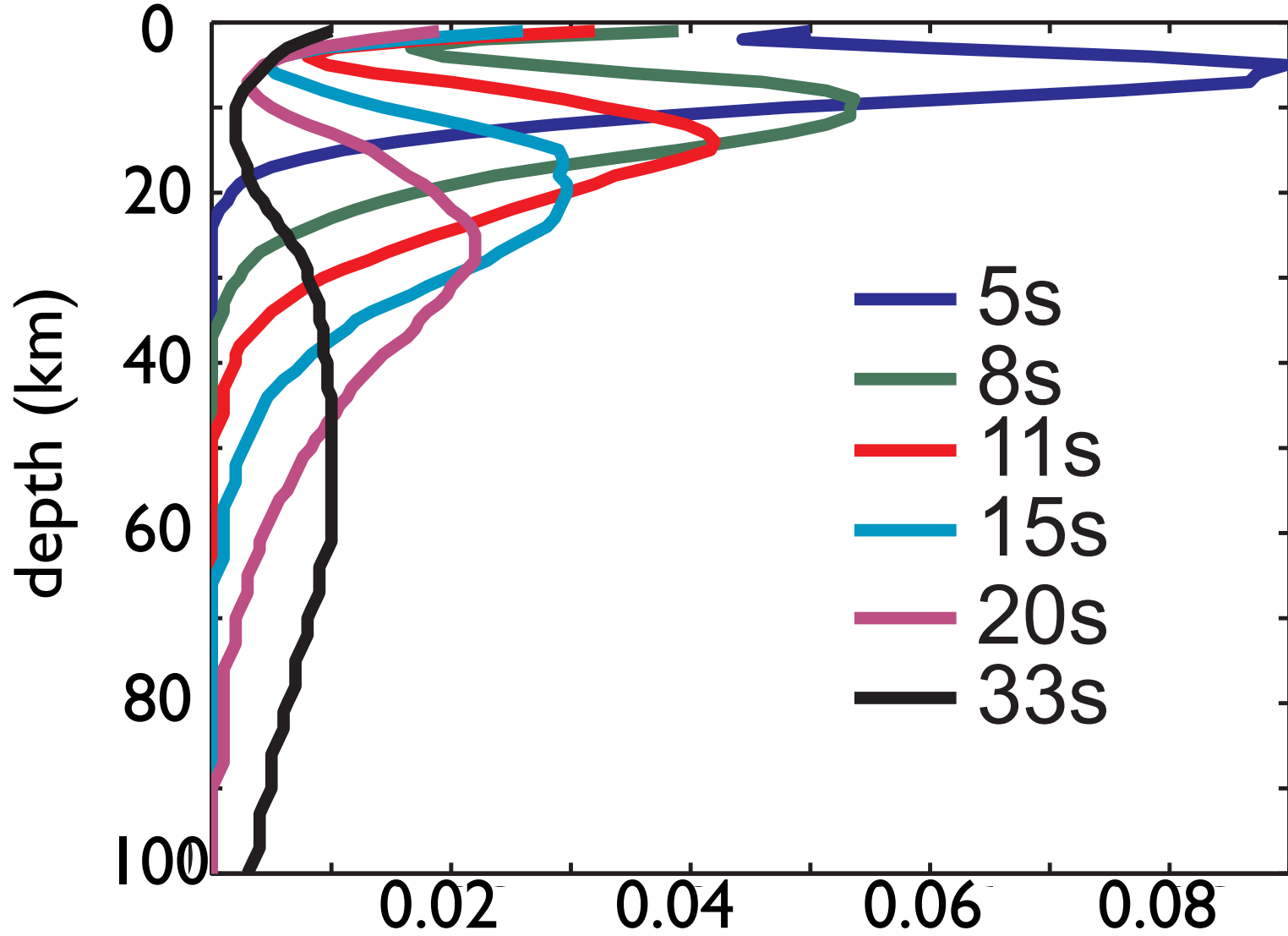
200 seconds



20 seconds



# Rayleigh wave sensitivity to $V_s$



## Requirements for high-resolution ( $\sim 50$ km) surface-wave tomography:

1. short paths to resolve small structures
2. short periods ( $5 < T < 25$  sec ) to resolve shallow (crustal) structure
3. evenly distributed sources (earthquakes) to create a tomographic image

These are not met by traditional earthquake-based techniques

Starting point:

Much of the “noise” recorded at a station is fundamental mode Rayleigh and Love waves arriving from different directions

Proposition:

The cross correlation of background seismic noise recorded at two stations provides information about the propagation speed (the phase velocity) of surface waves between the two stations.

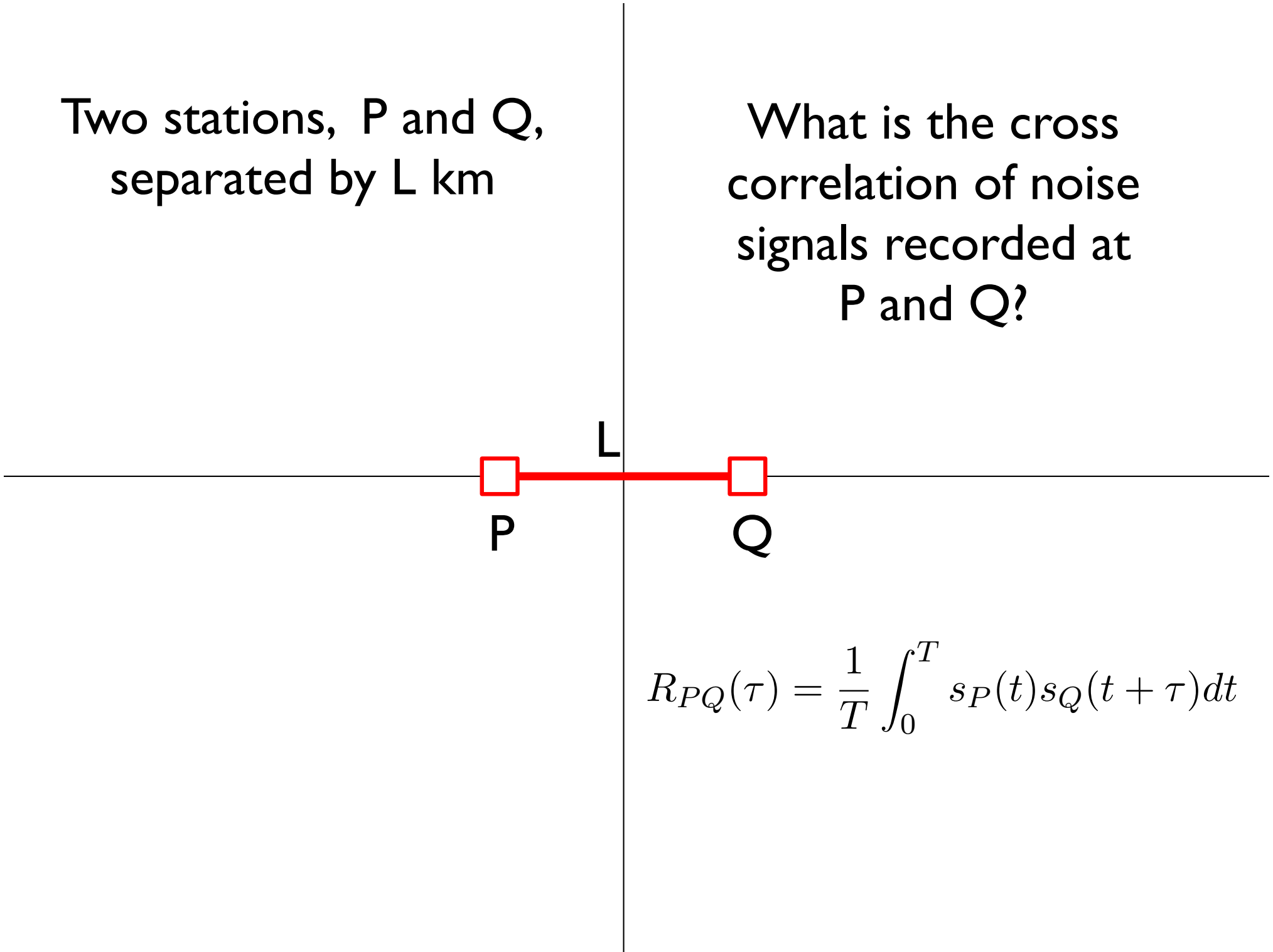


Explored by many, e.g., Aki, Campillo, Cox, Lobkis, Ritzwoller, Sabra, Shapiro, Snieder and many others, also in other fields



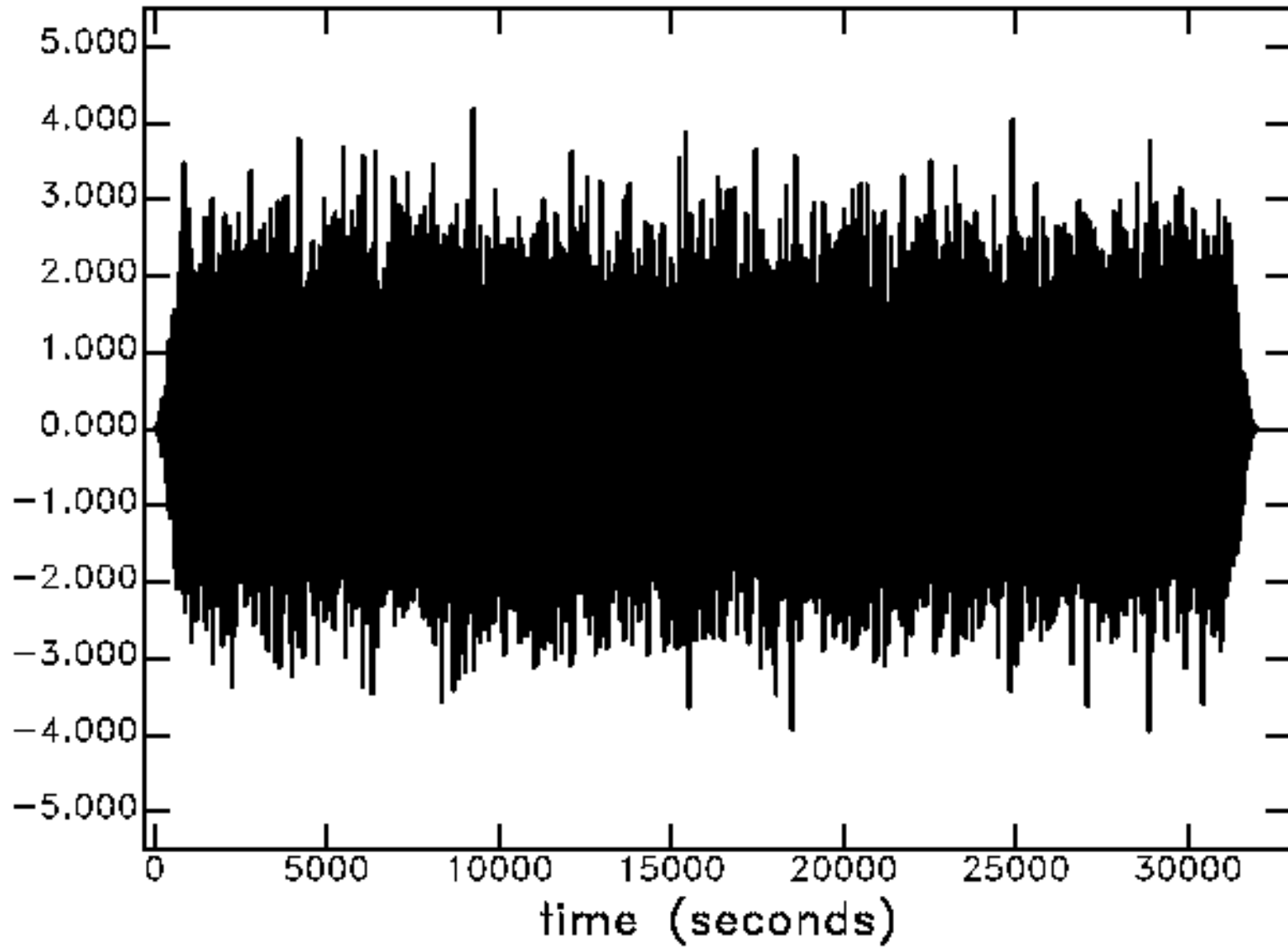
Two stations, P and Q,  
separated by L km

What is the cross  
correlation of noise  
signals recorded at  
P and Q?

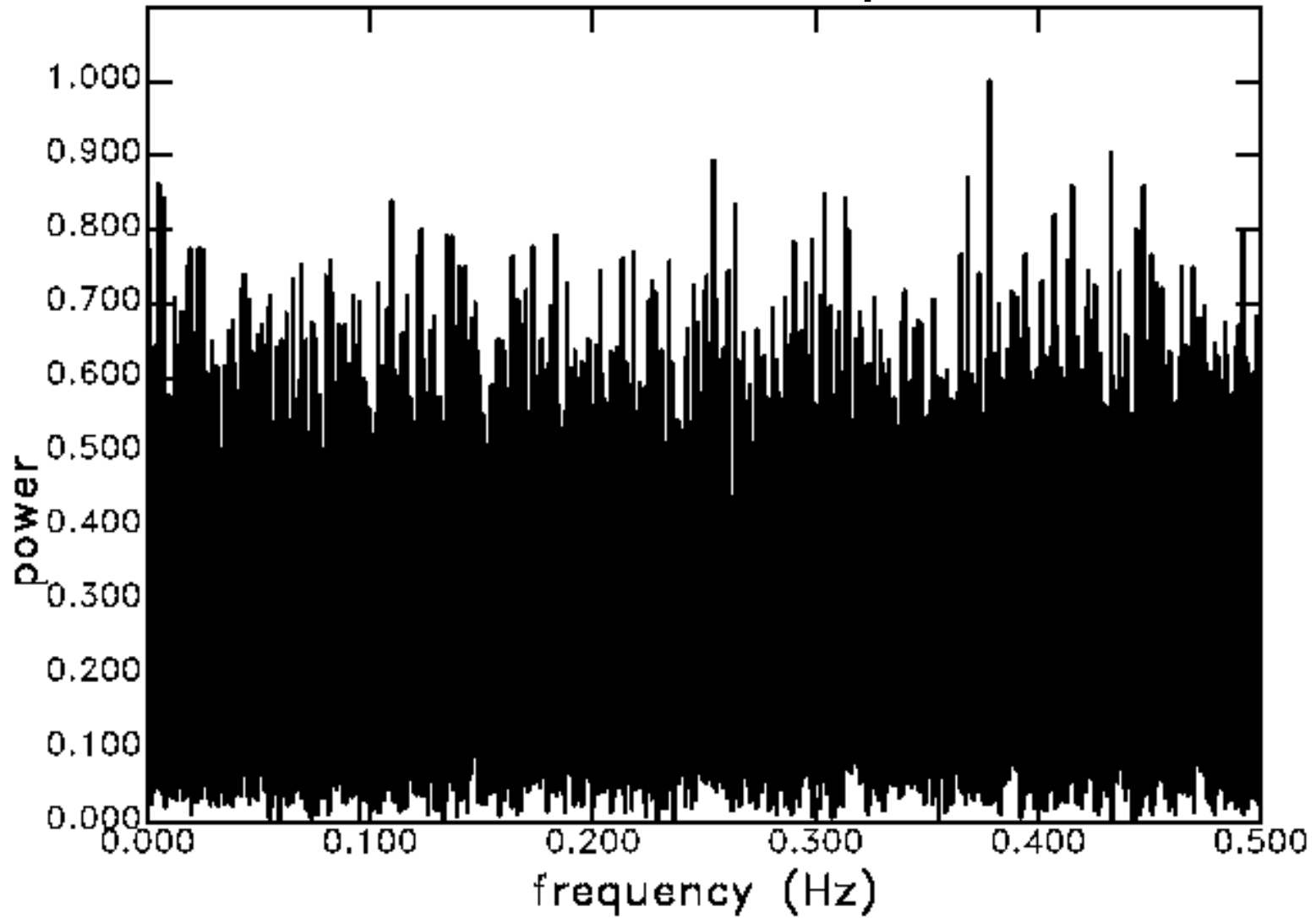


$$R_{PQ}(\tau) = \frac{1}{T} \int_0^T s_P(t) s_Q(t + \tau) dt$$

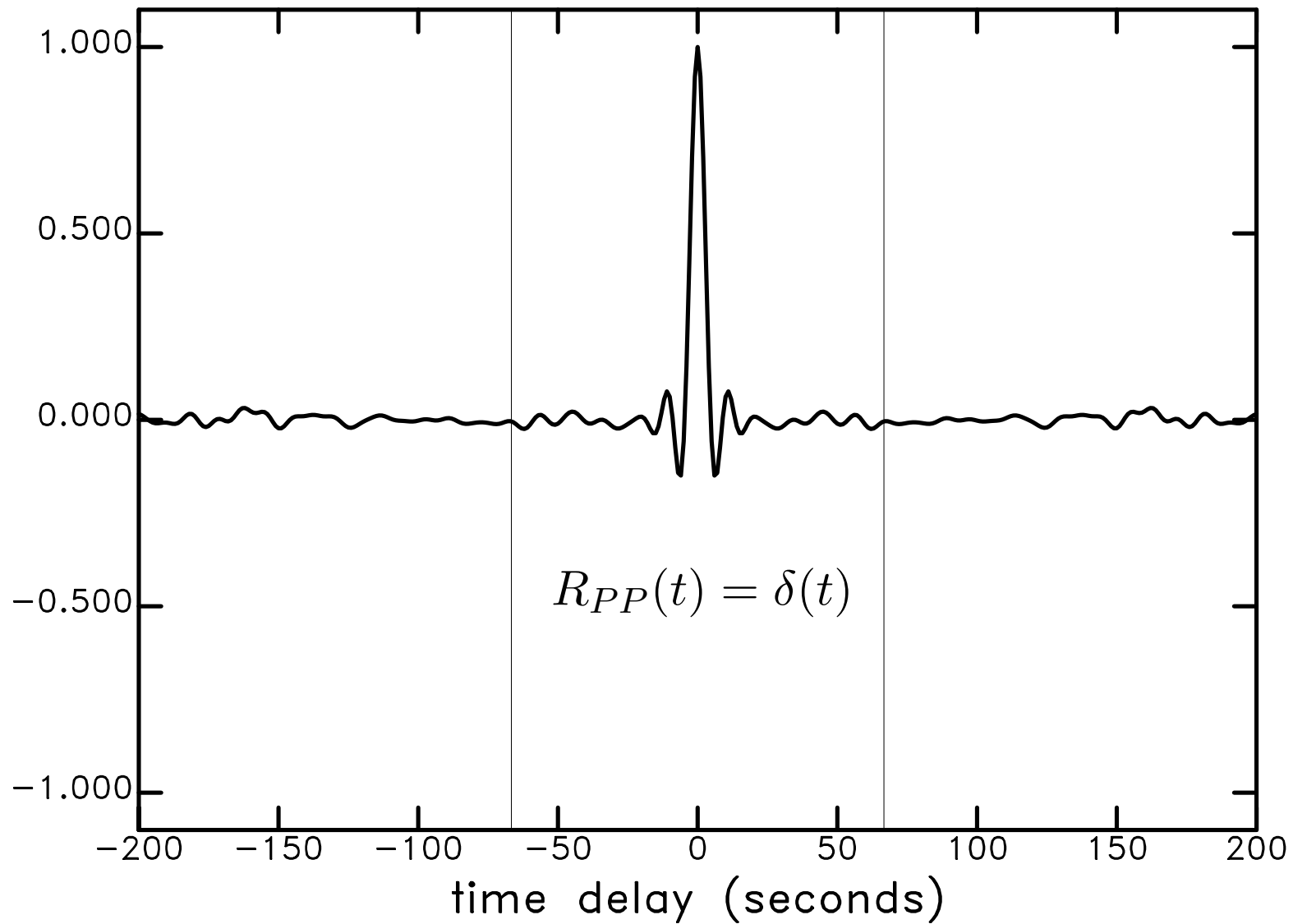
# Gaussian white noise, 1 Hz sampling



# Gaussian white noise spectrum

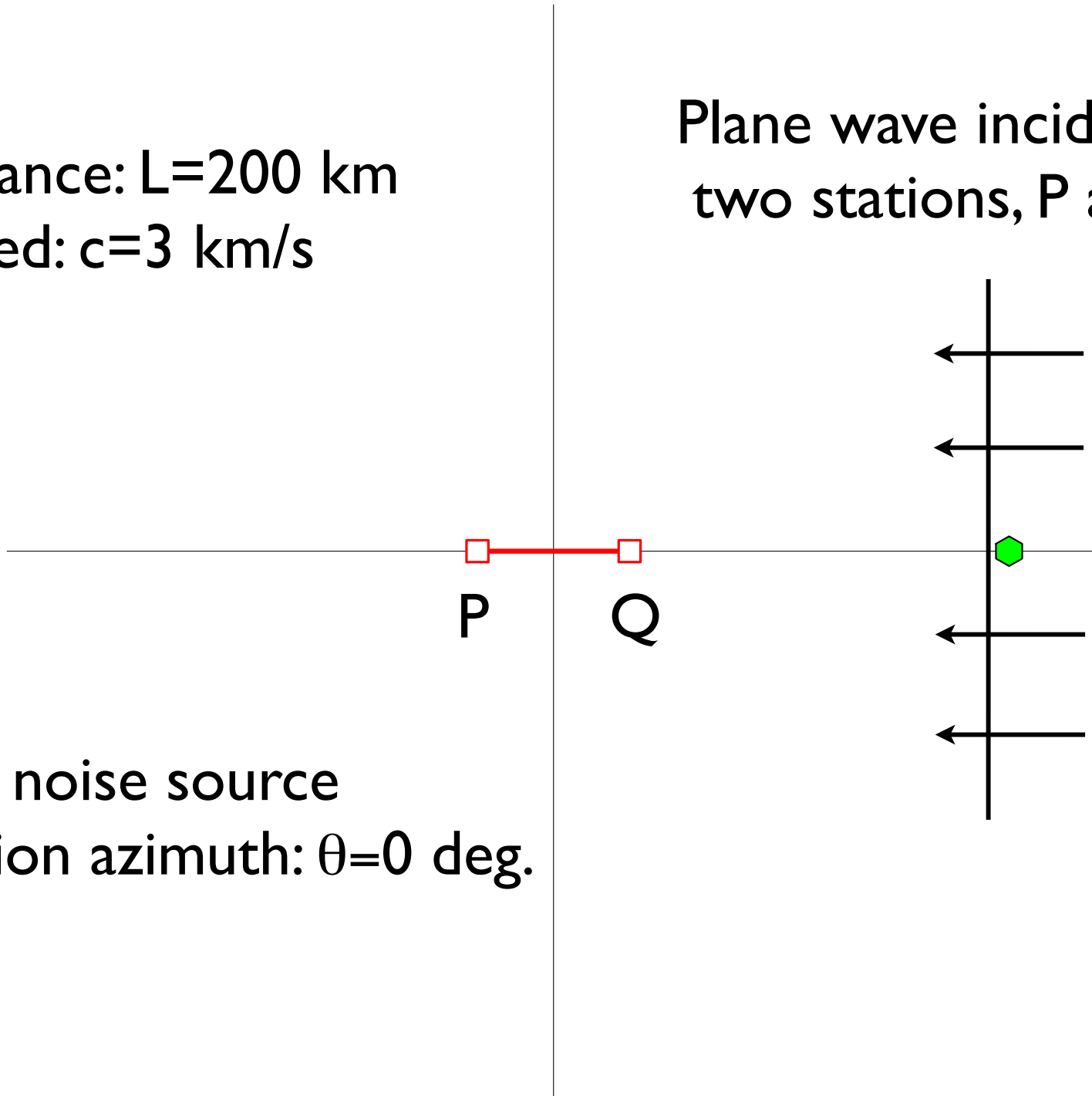


# Auto-correlation function of noise



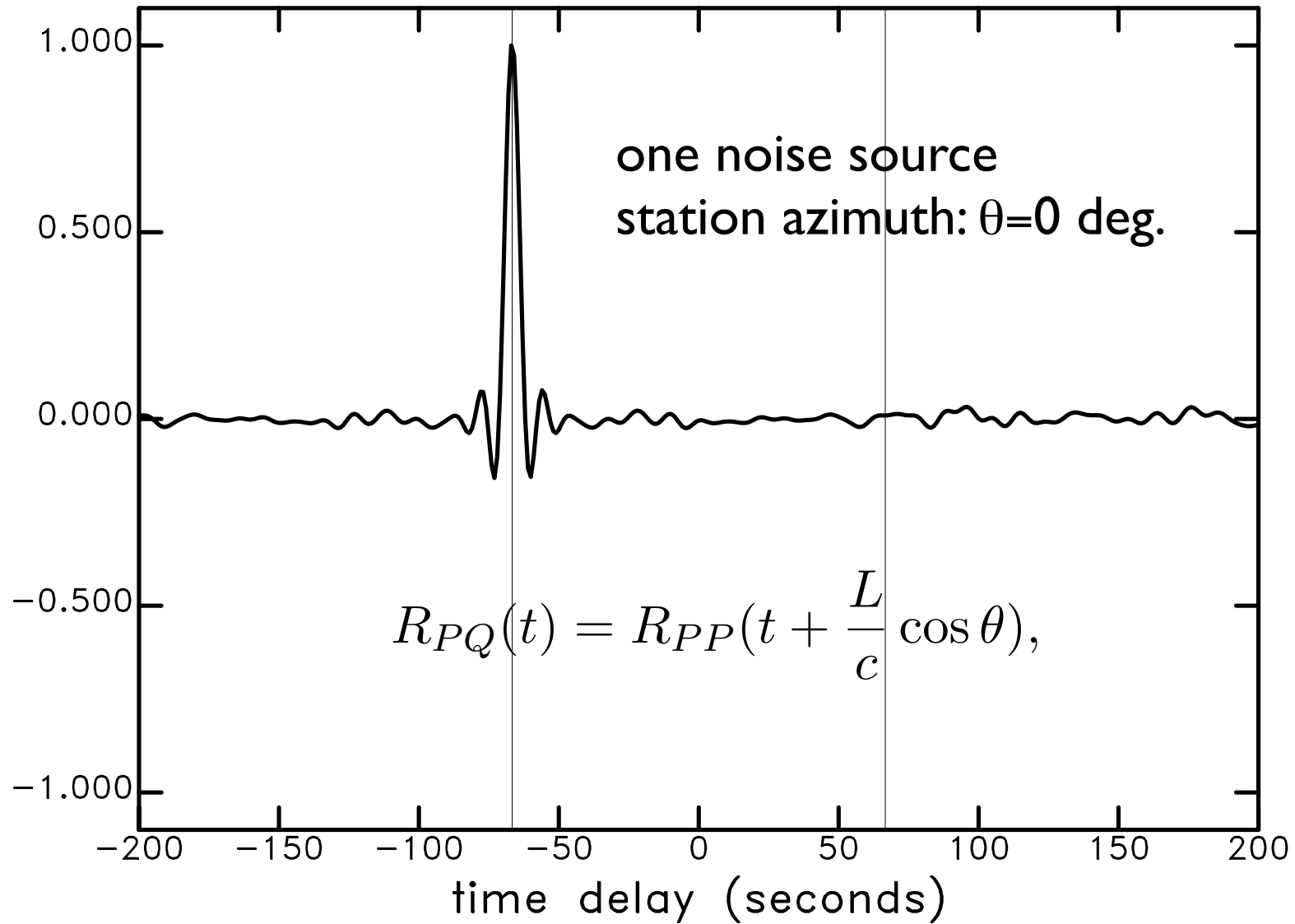
distance:  $L=200$  km  
speed:  $c=3$  km/s

Plane wave incident on  
two stations, P and Q

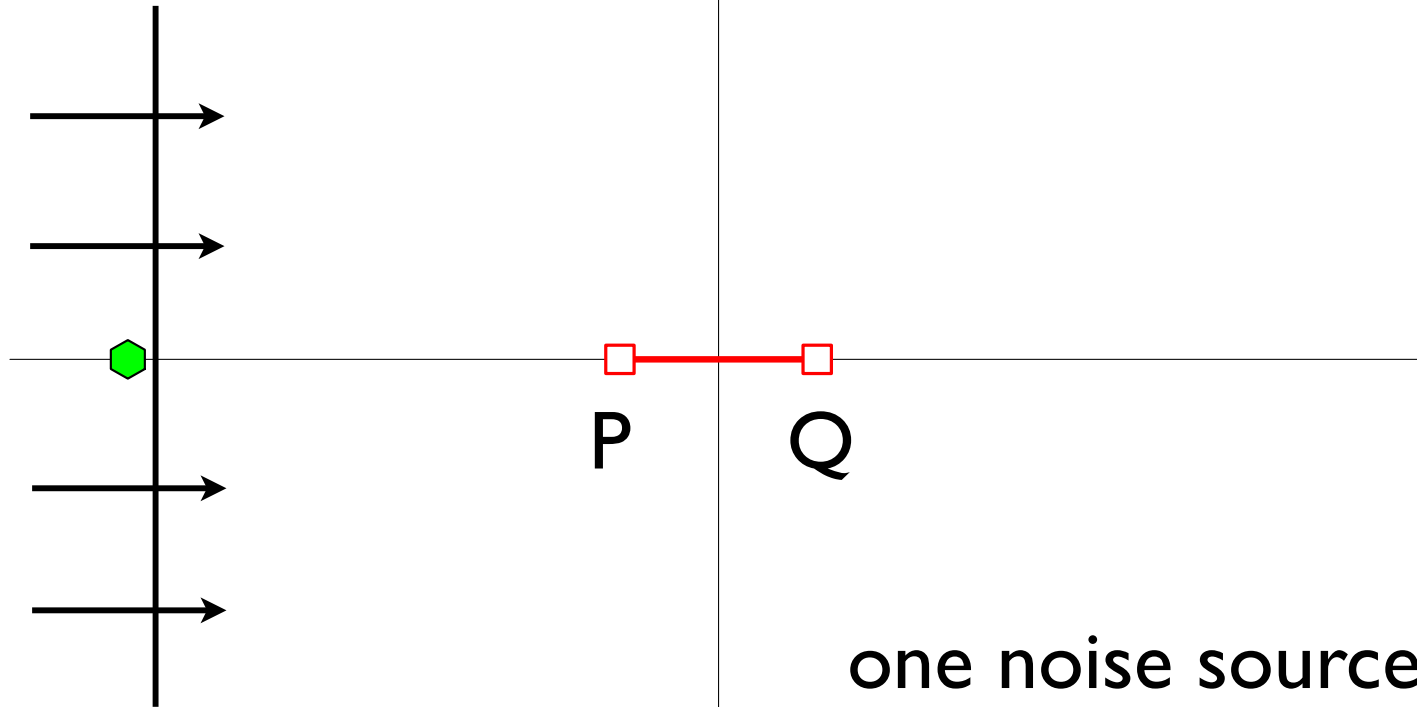


one noise source  
station azimuth:  $\theta=0$  deg.

# Cross-correlation function, P and Q

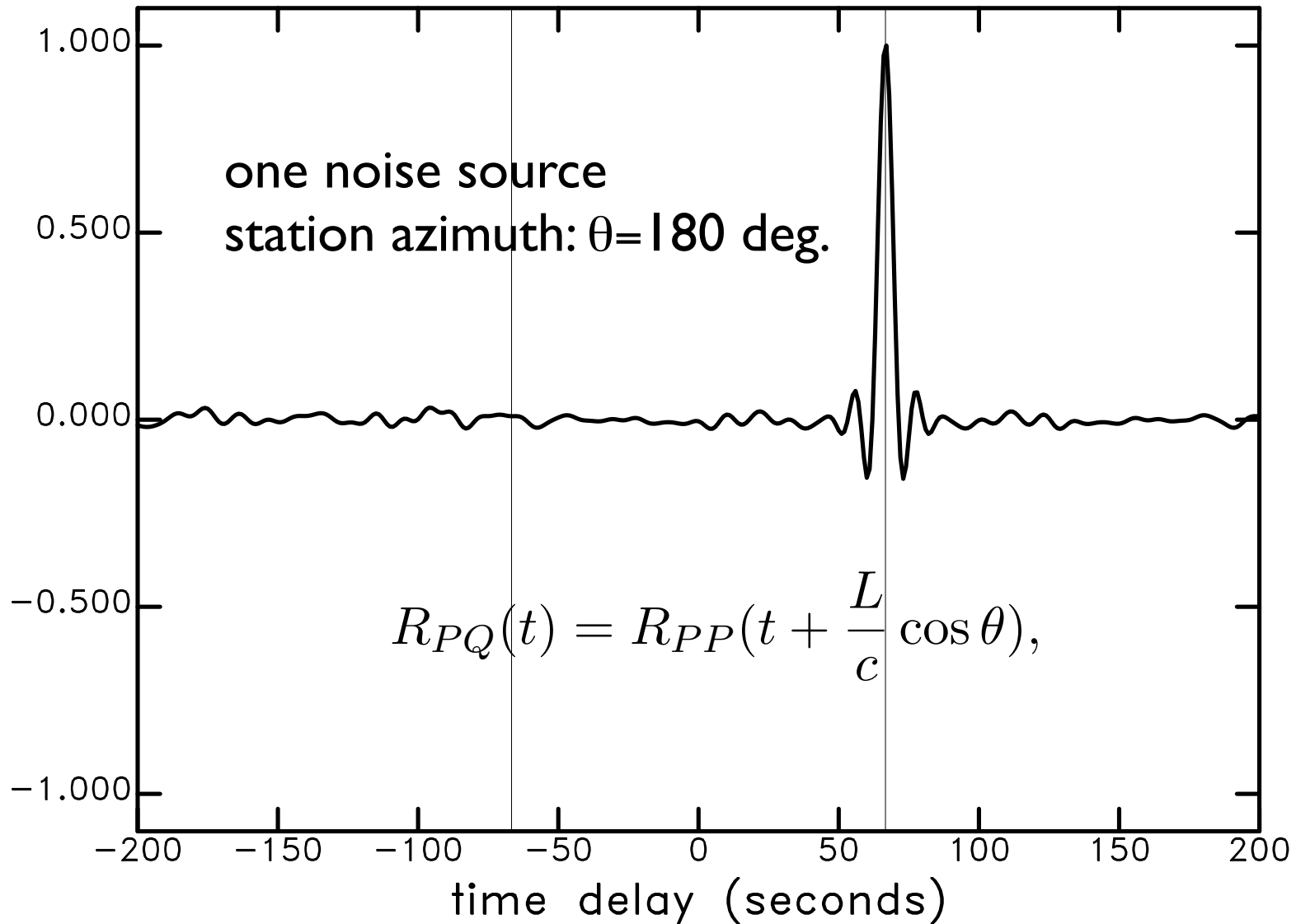


Plane wave of noise  
incident on two  
stations, P and Q



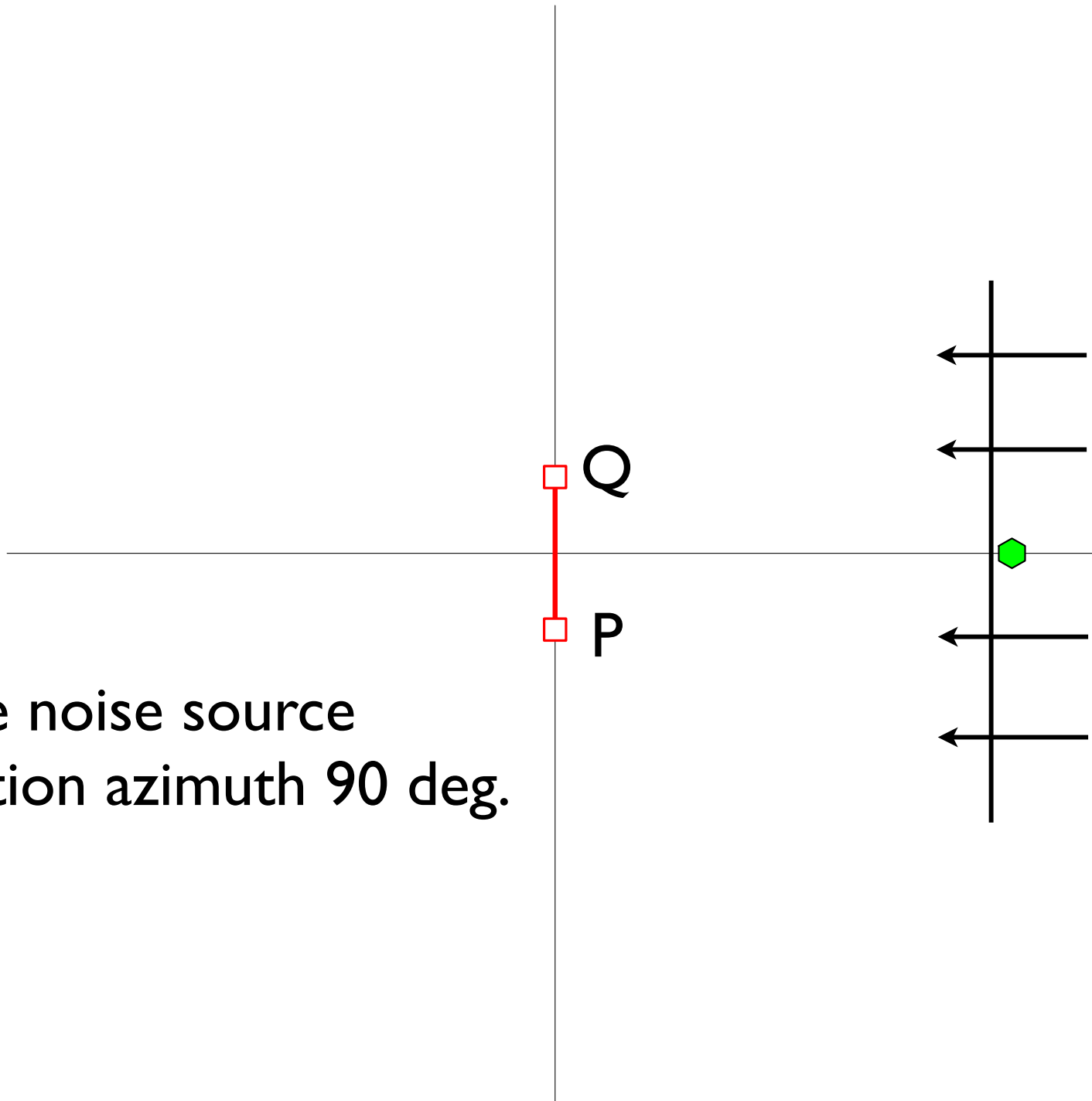
one noise source  
station azimuth 180 deg.

# Cross-correlation function, P and Q

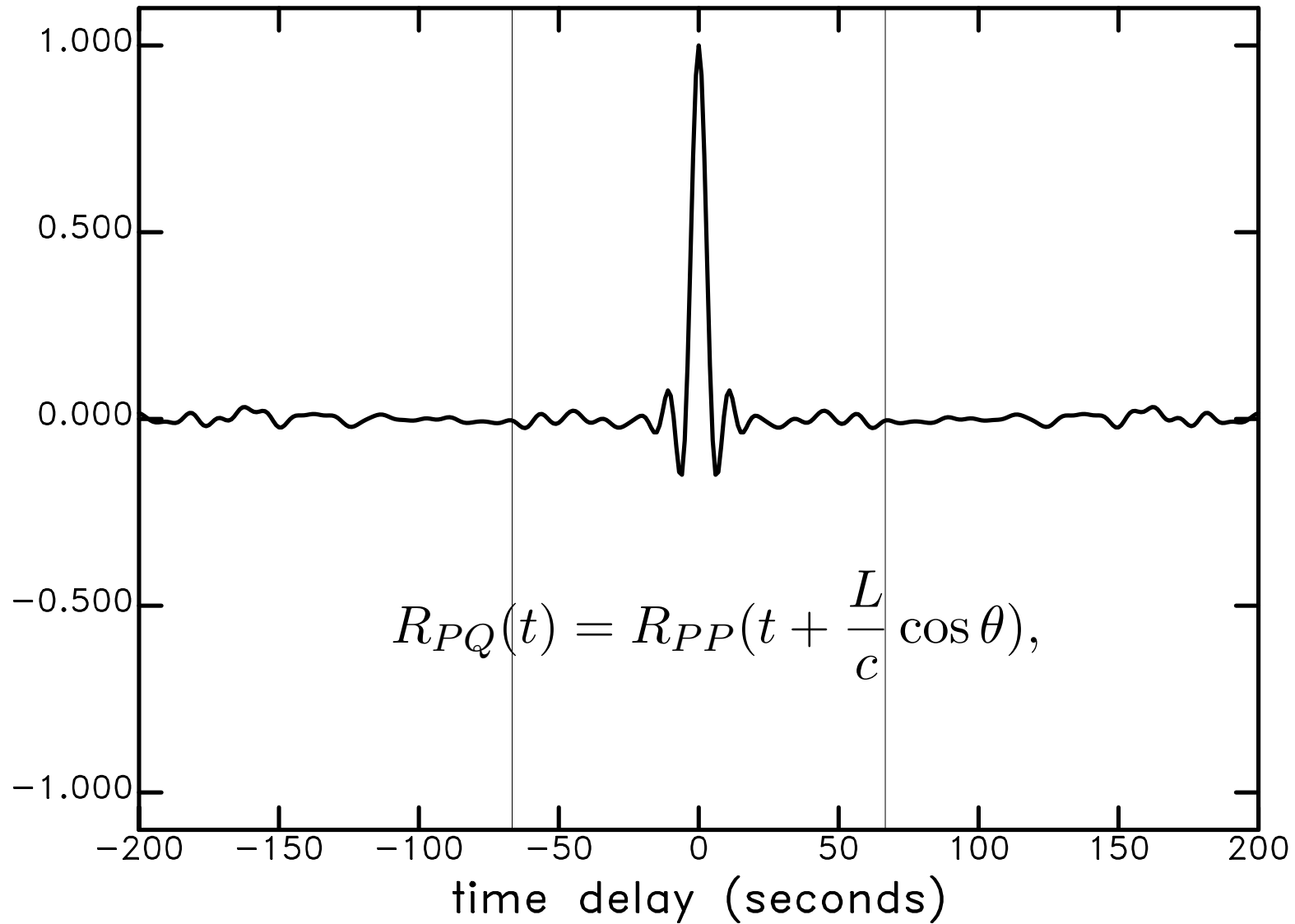


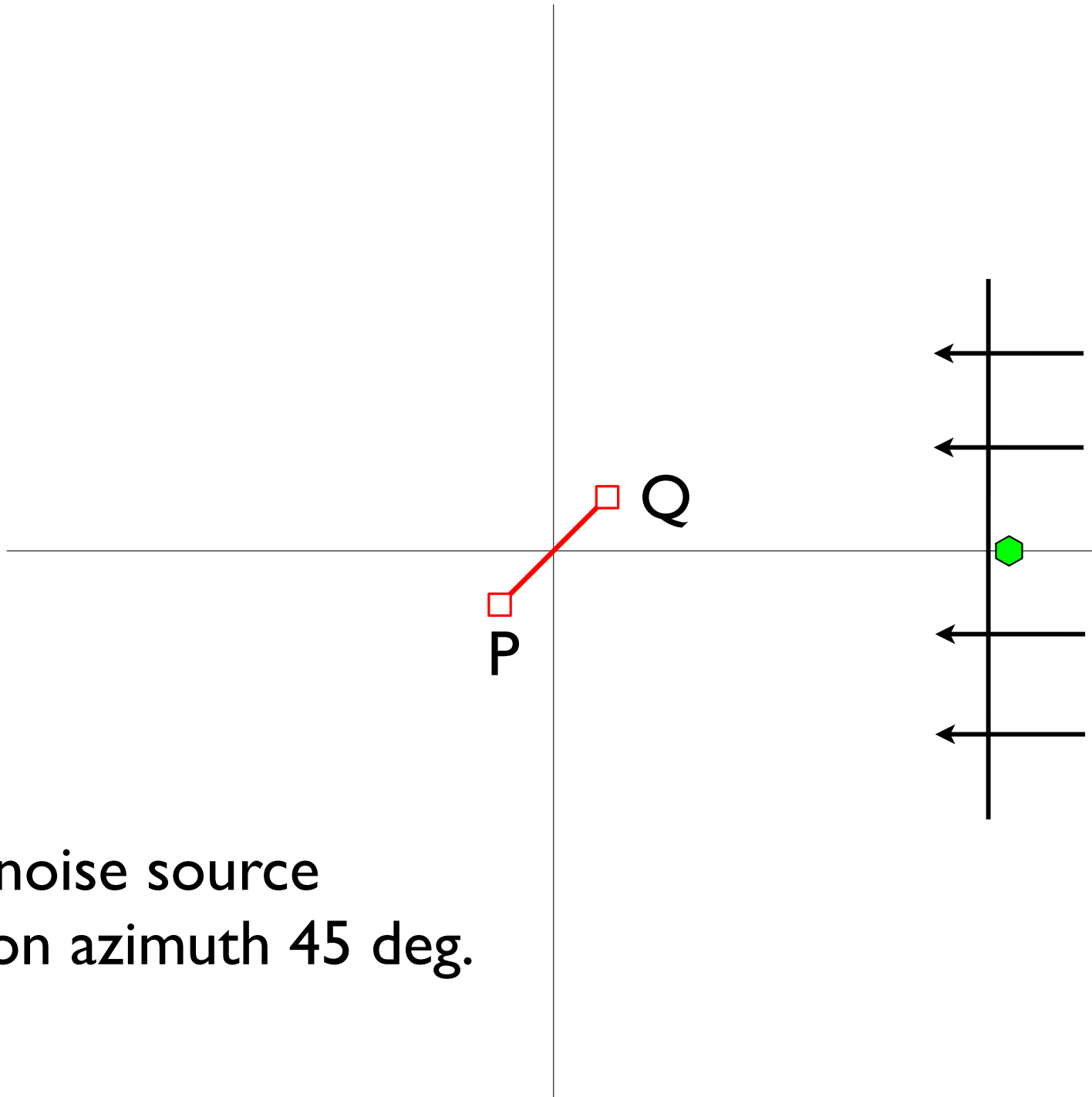


one noise source  
station azimuth 90 deg.



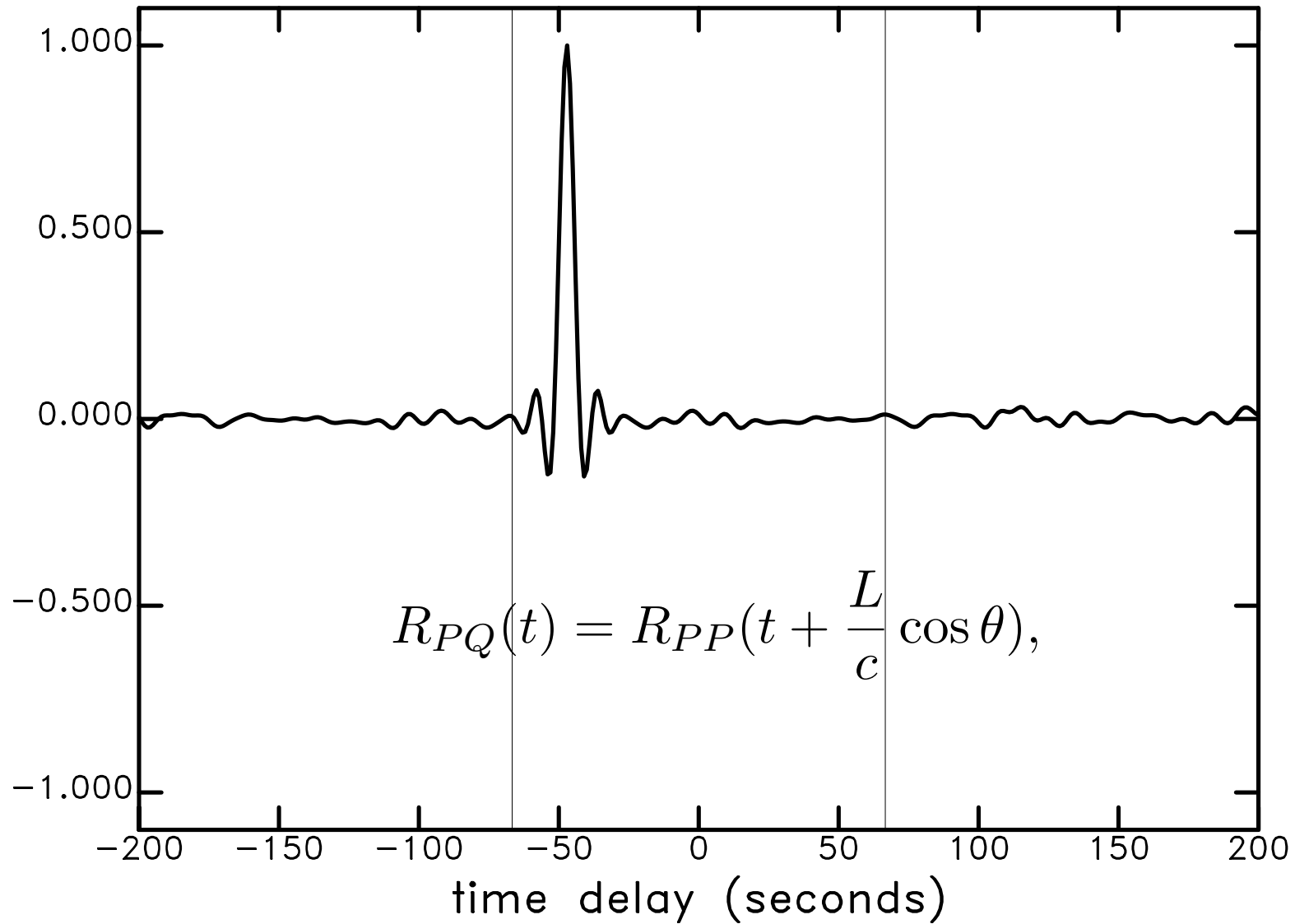
# Cross-correlation function, P and Q

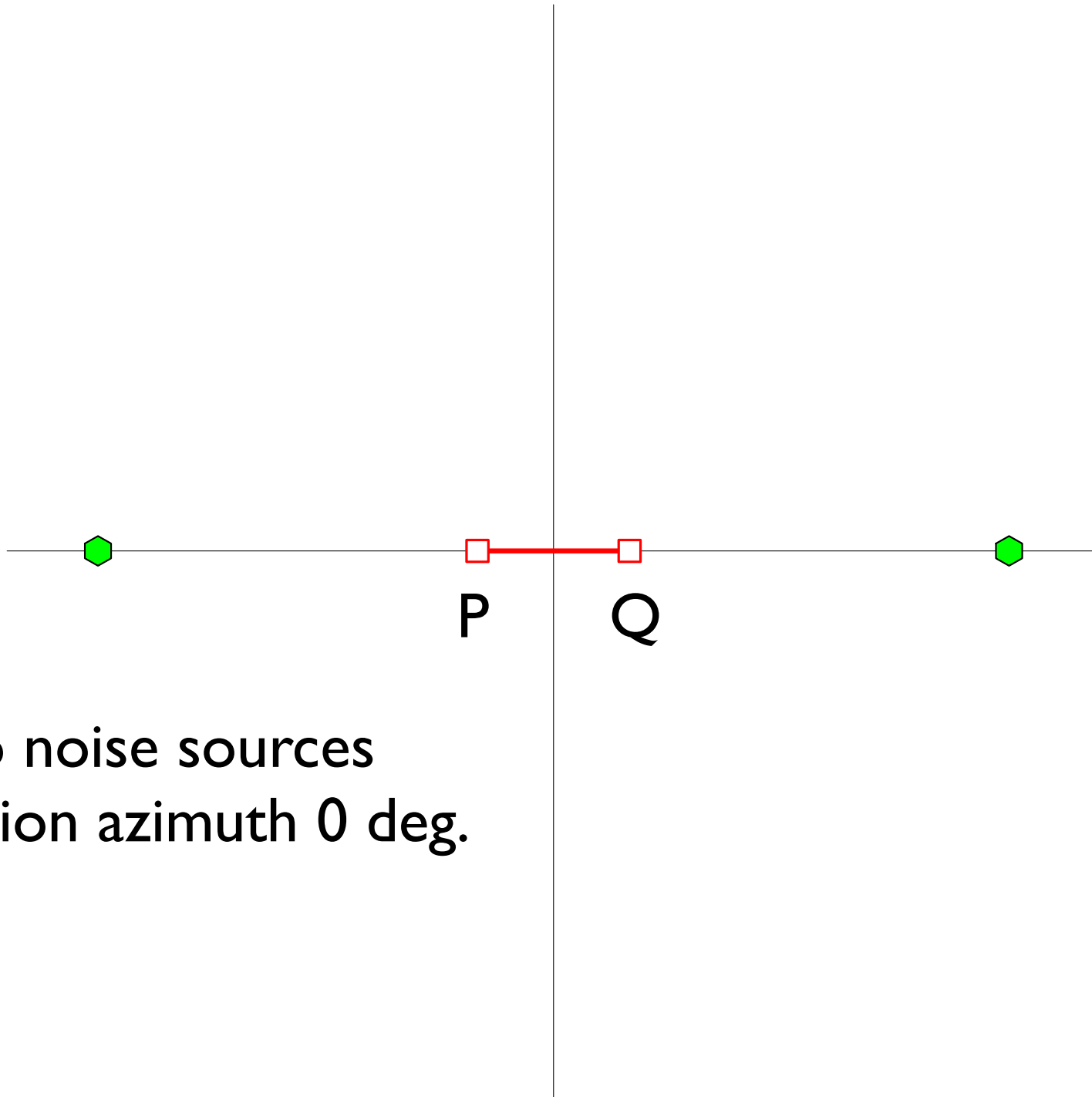




one noise source  
station azimuth 45 deg.

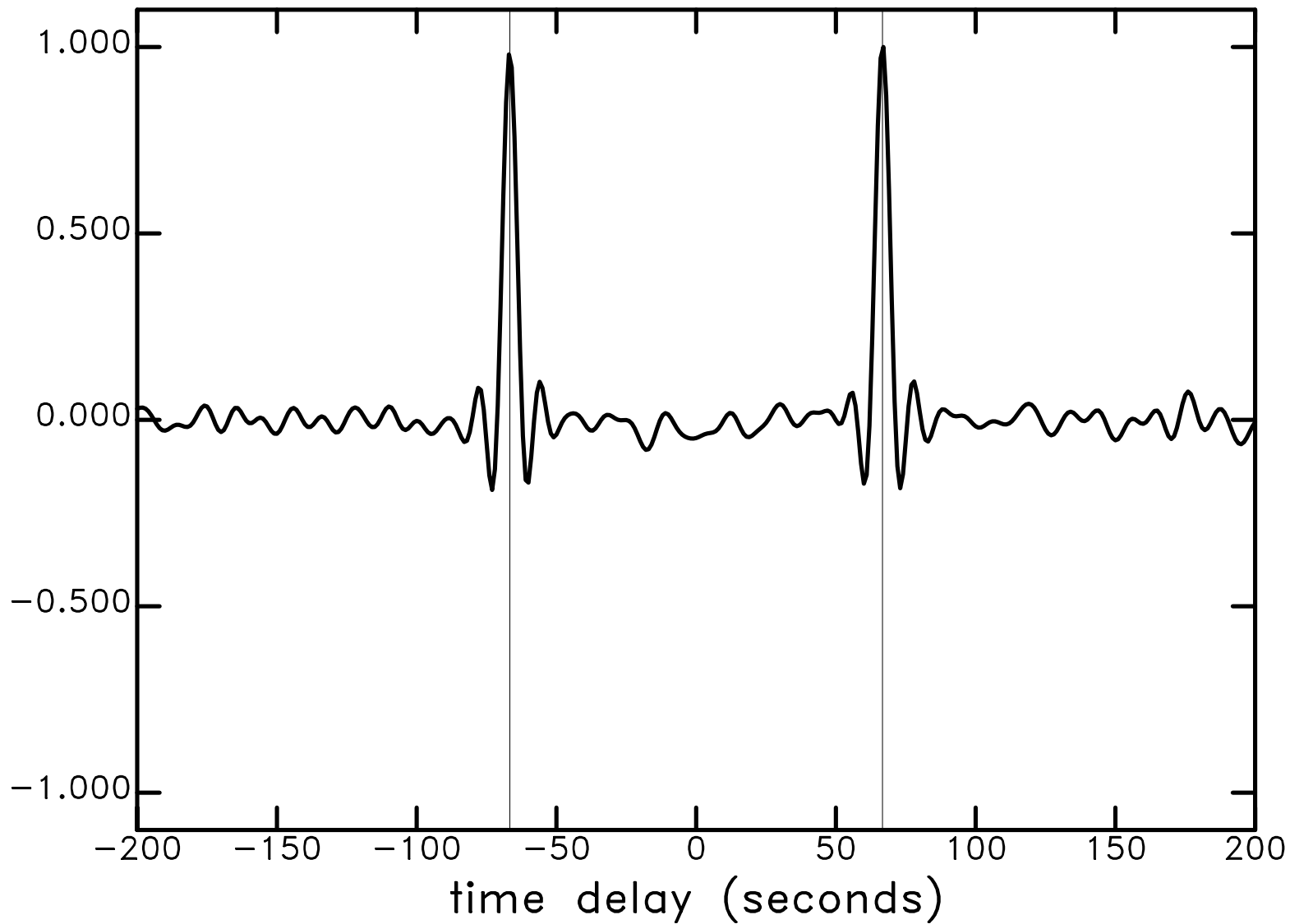
# Cross-correlation function, P and Q

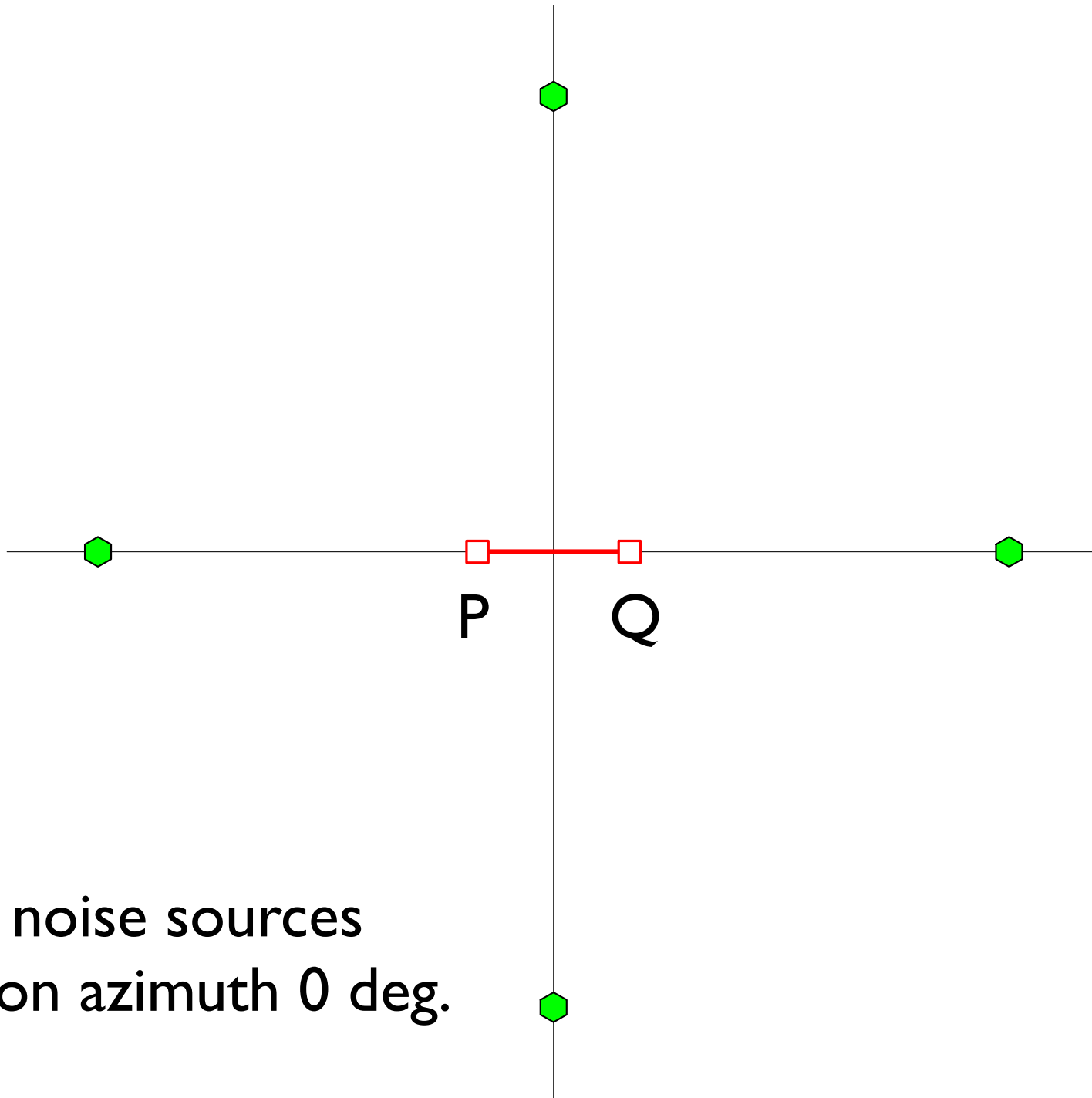




two noise sources  
station azimuth 0 deg.

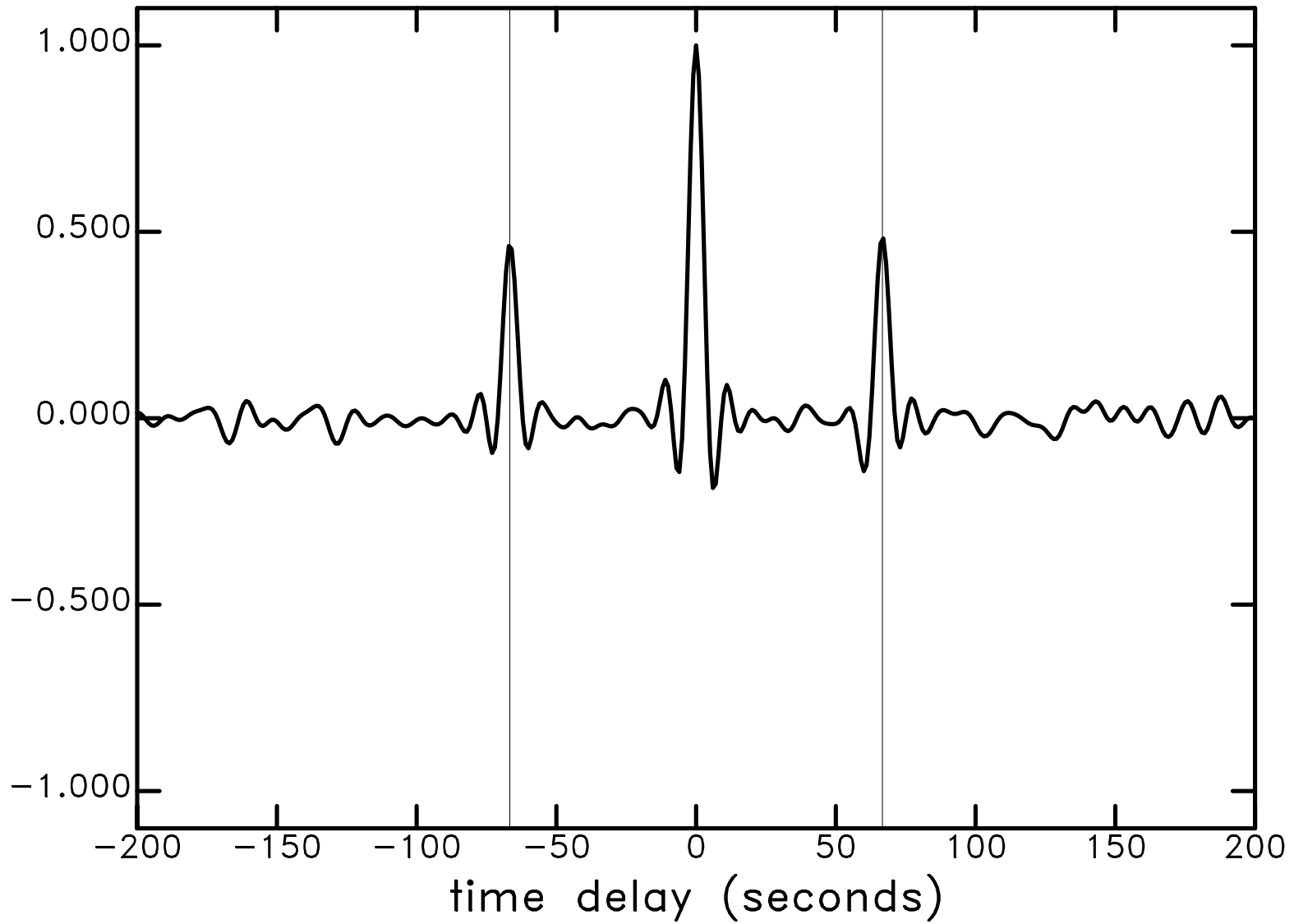
# Cross-correlation function, P and Q





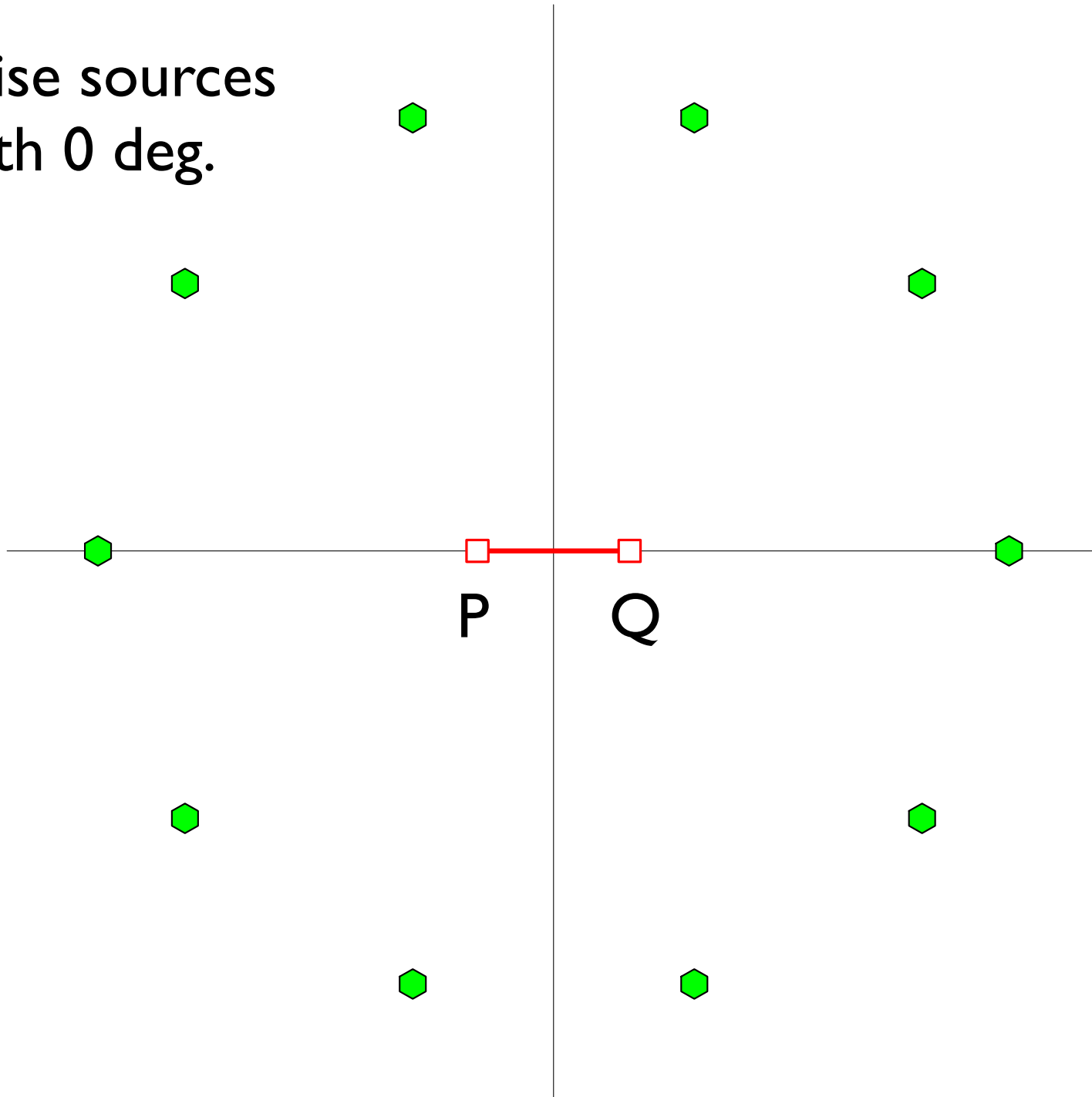
four noise sources  
station azimuth 0 deg.

# Cross-correlation function, P and Q

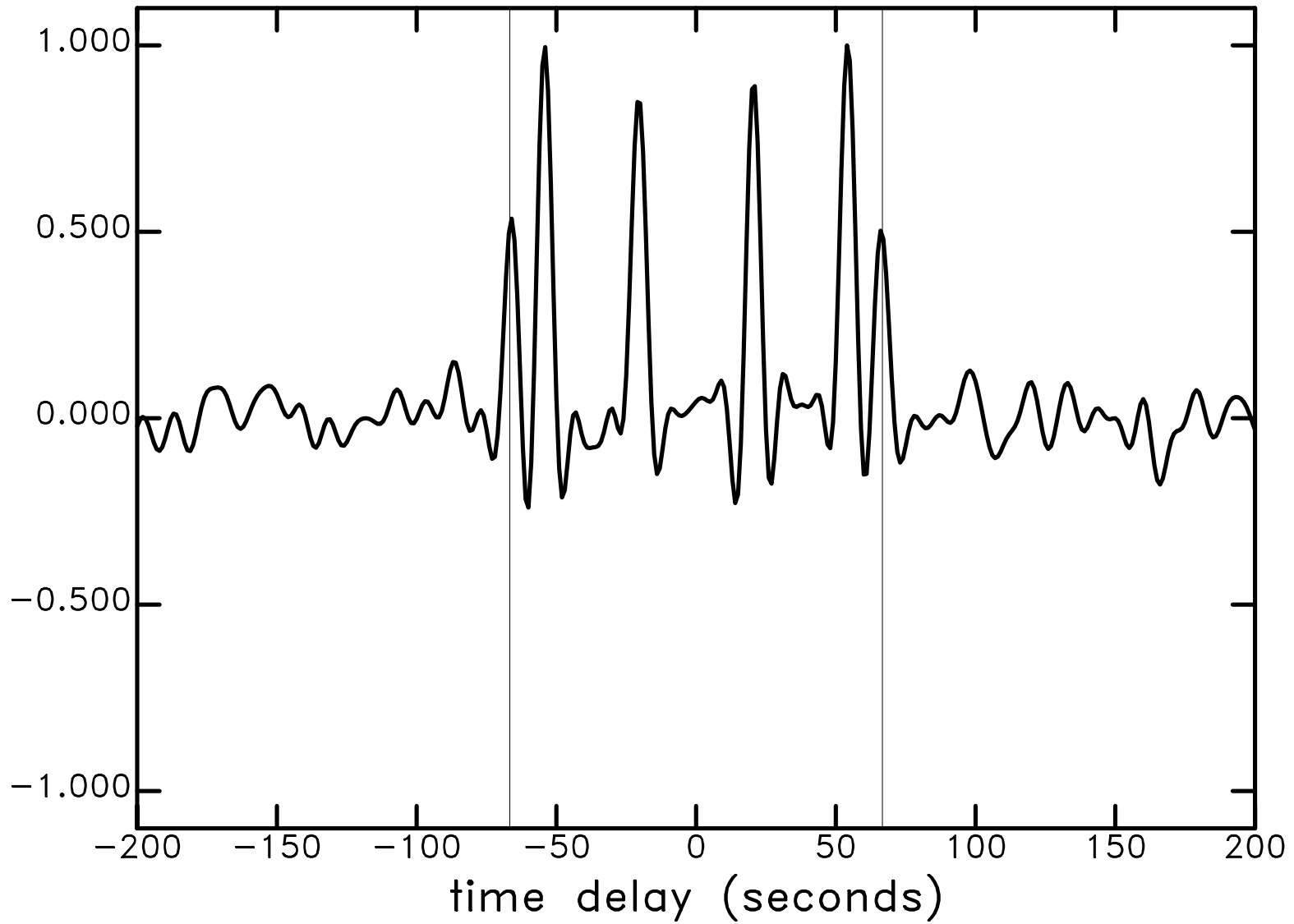




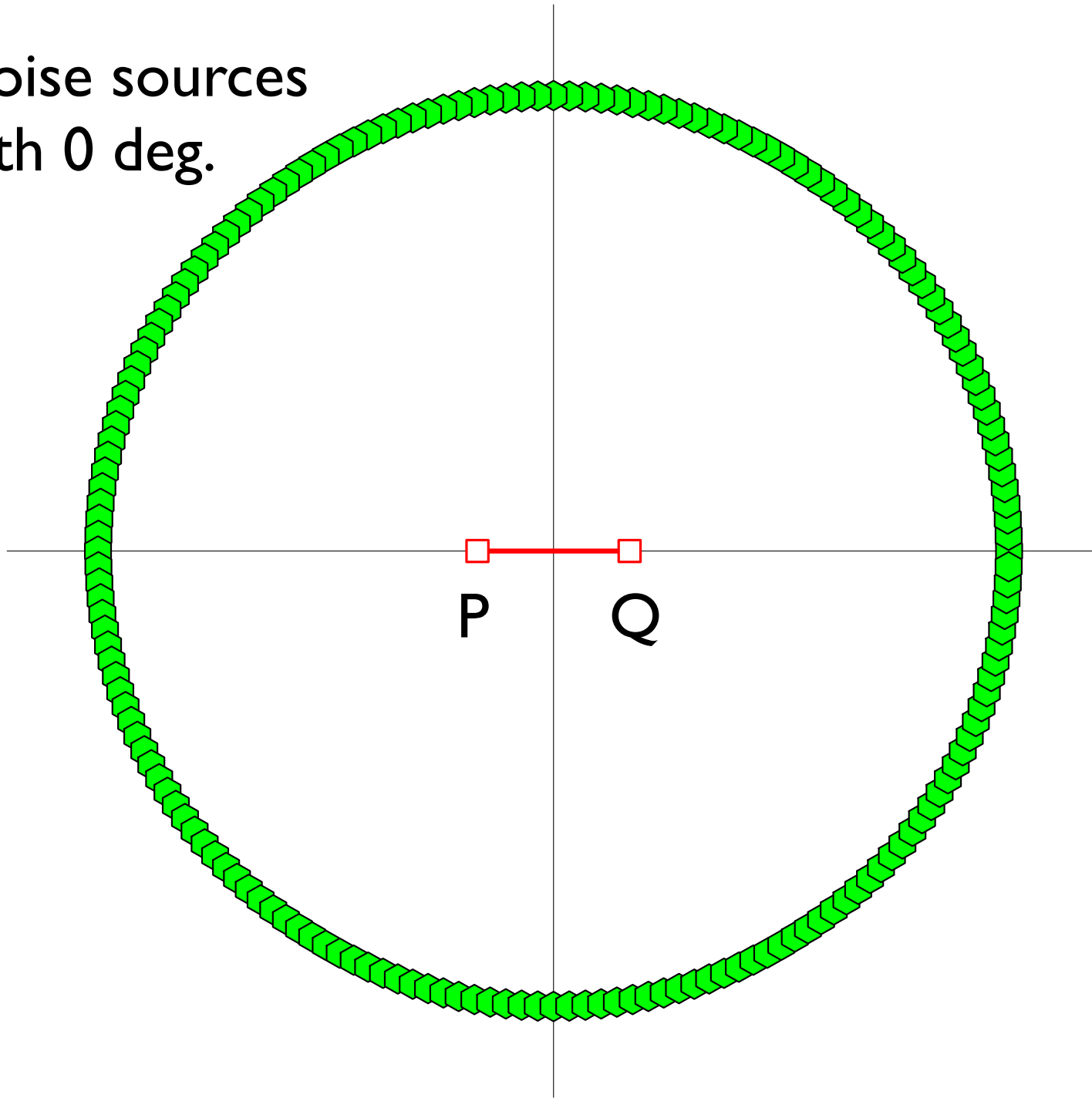
10 noise sources  
azimuth 0 deg.



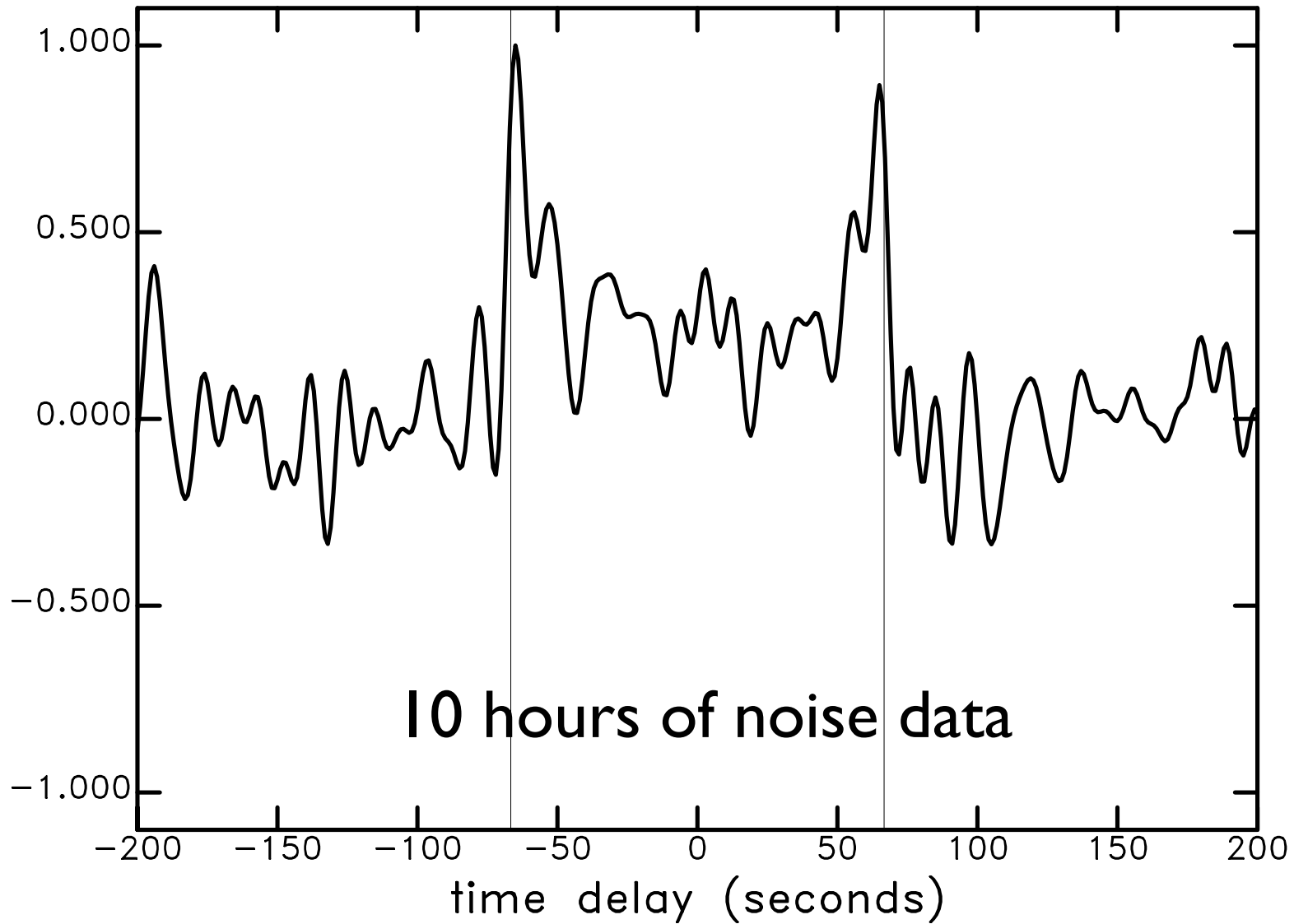
# Cross-correlation function, P and Q



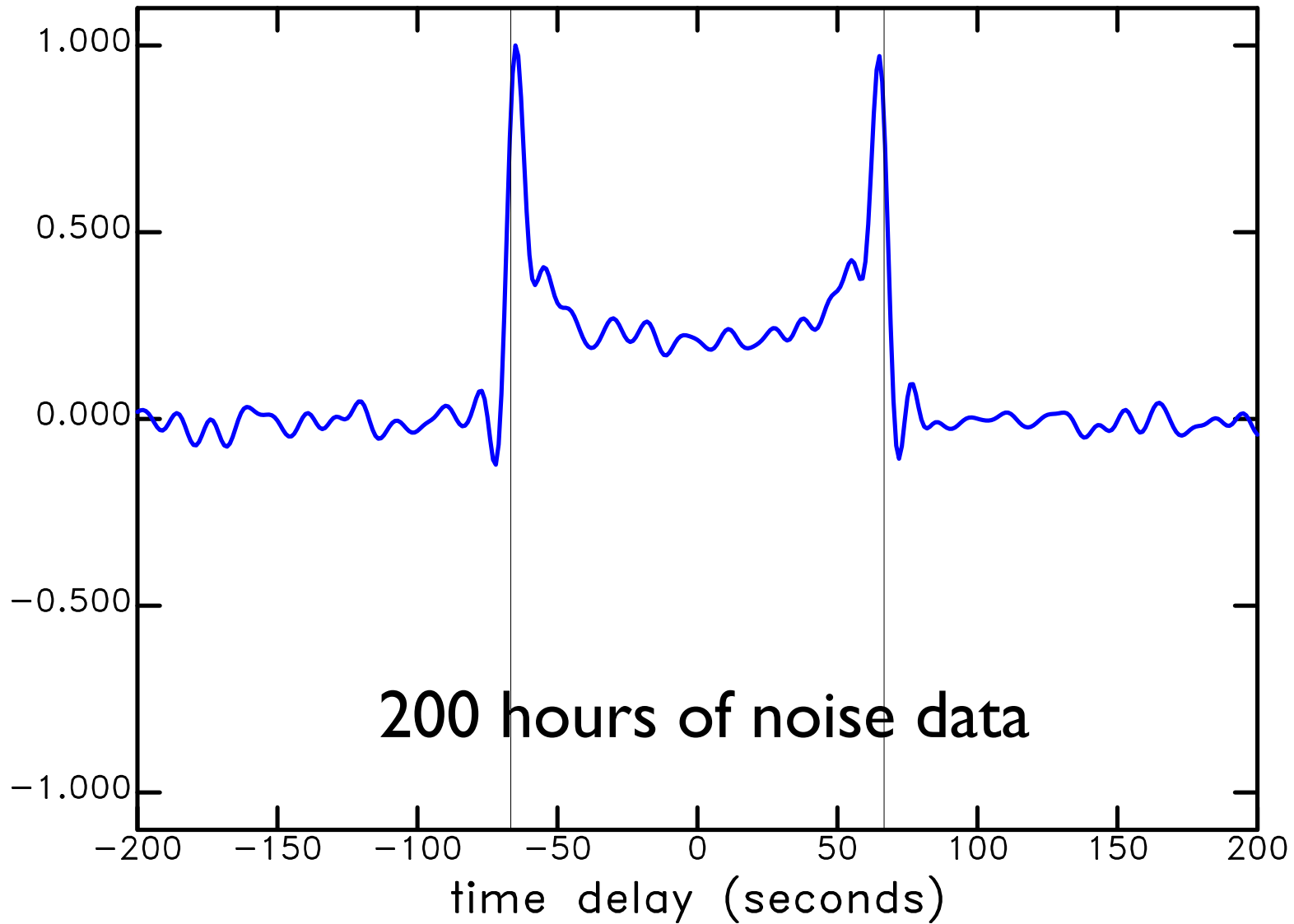
180 noise sources  
azimuth 0 deg.



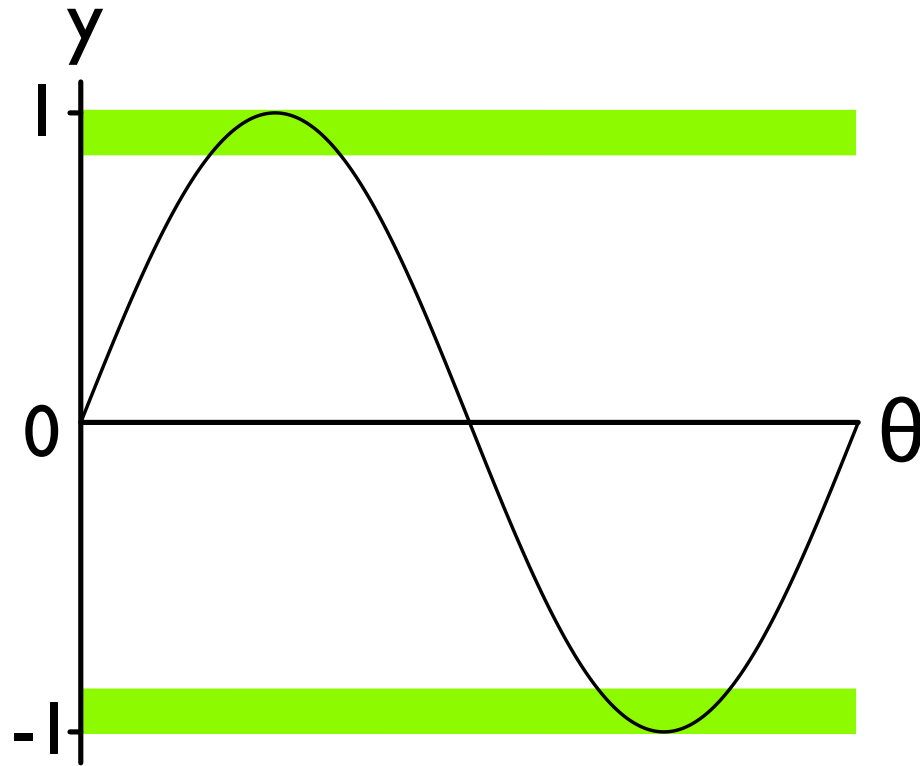
# Cross-correlation function, P and Q



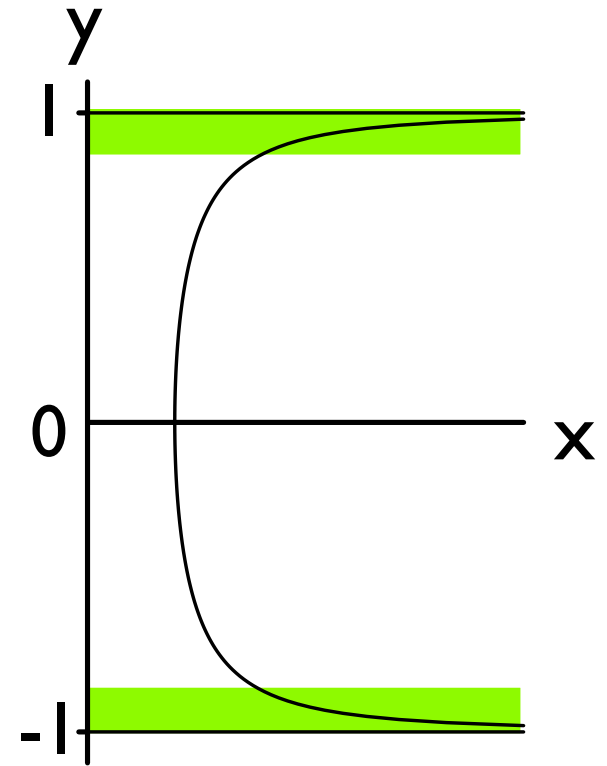
# Cross-correlation function, P and Q



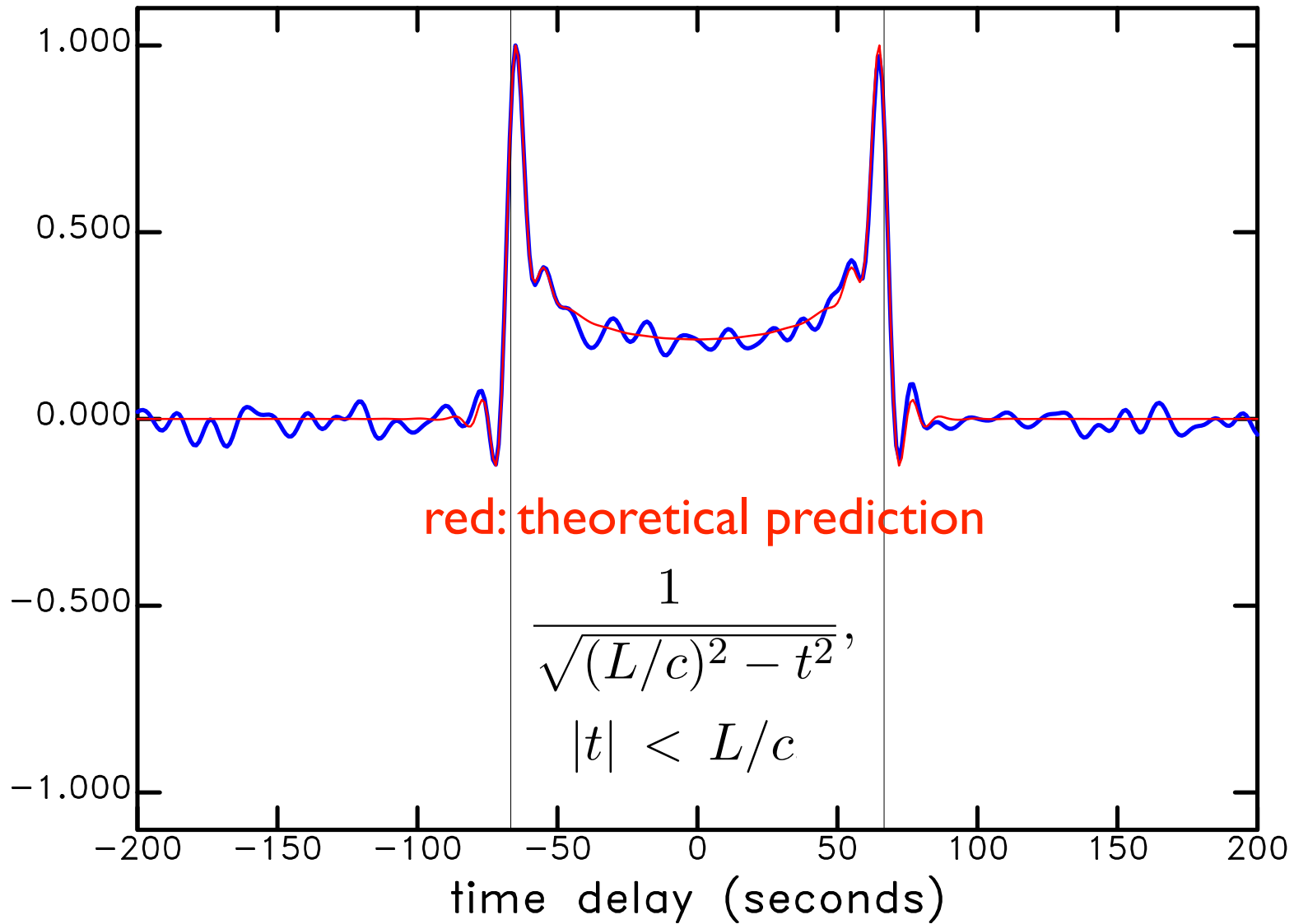
sine function  
 $y = \sin(\theta)$



pdf of sine function  
 $x = p(y)$



# Cross-correlation function, P and Q



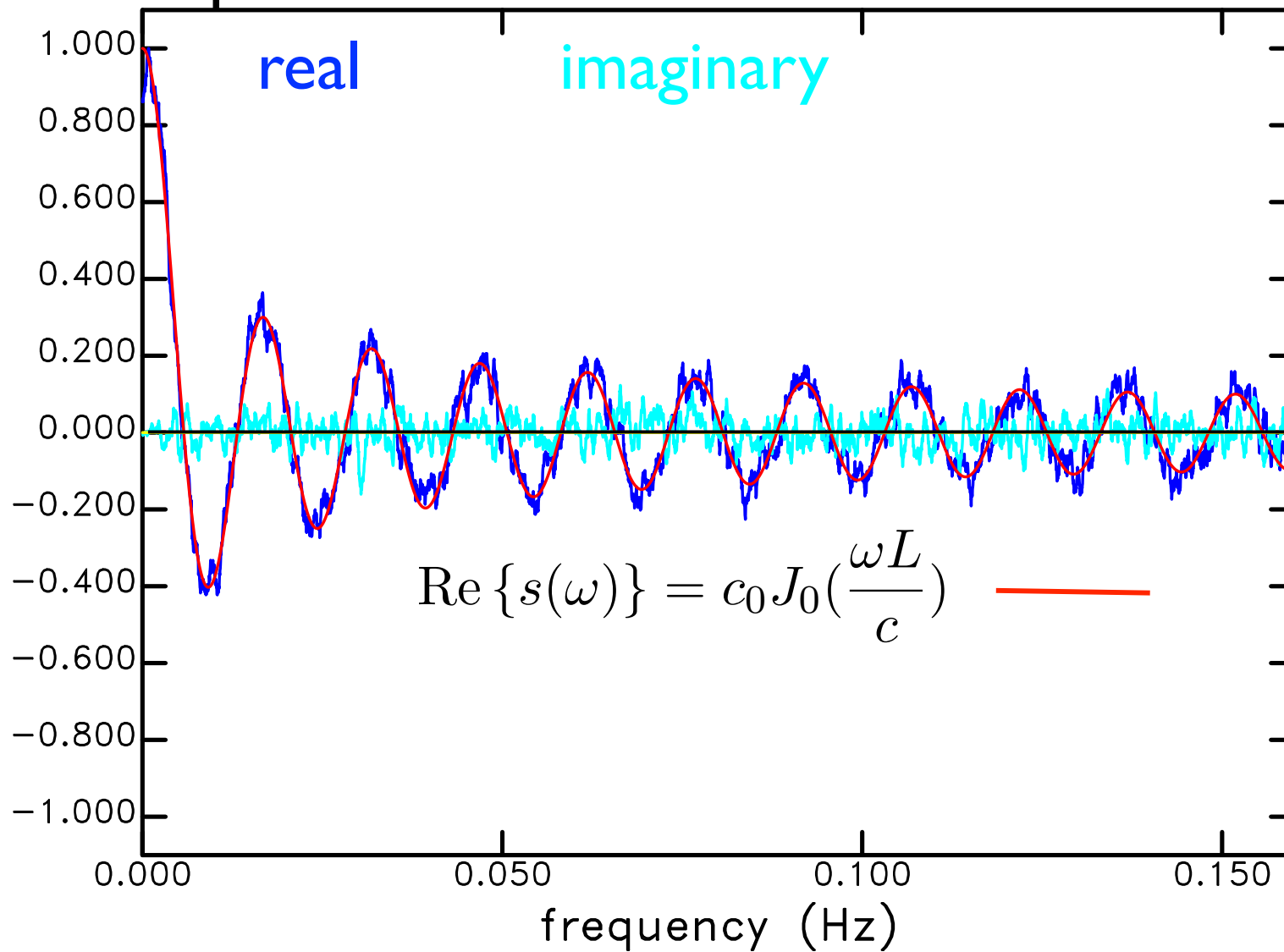
What about the Fourier transform?



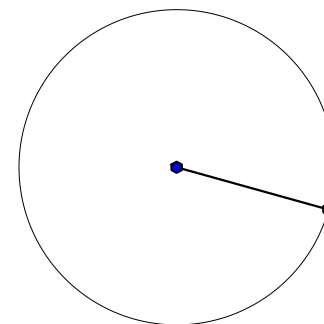
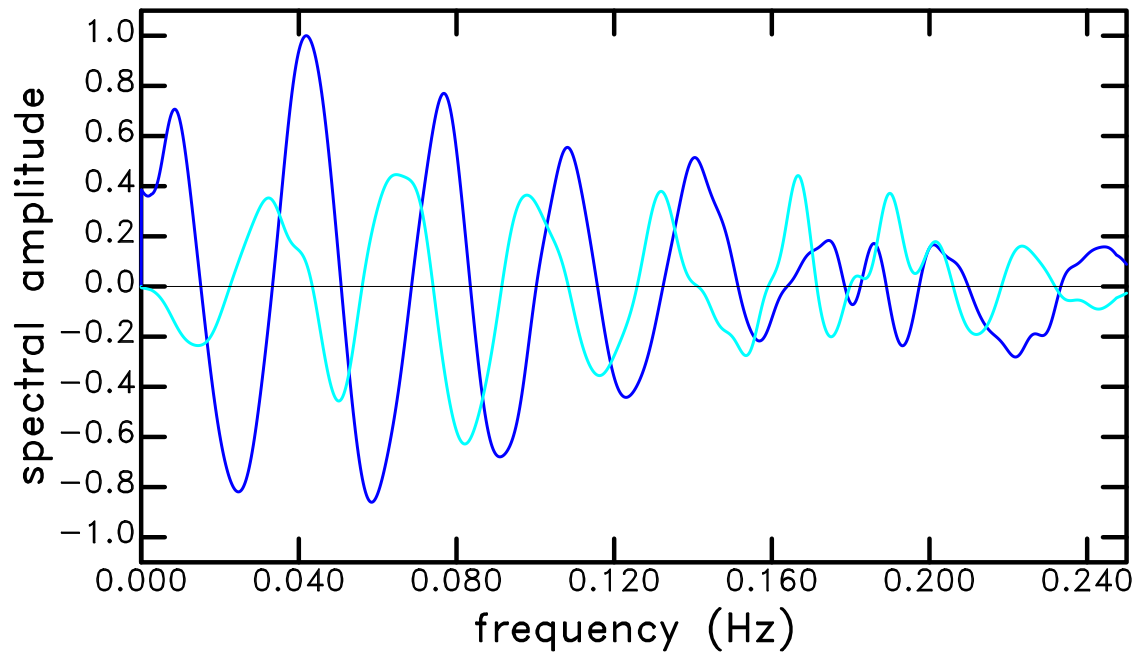
What about the Fourier transform?

$$\frac{1}{\sqrt{(L/c)^2 - t^2}} \longrightarrow J_0\left(\frac{\omega L}{c}\right)$$

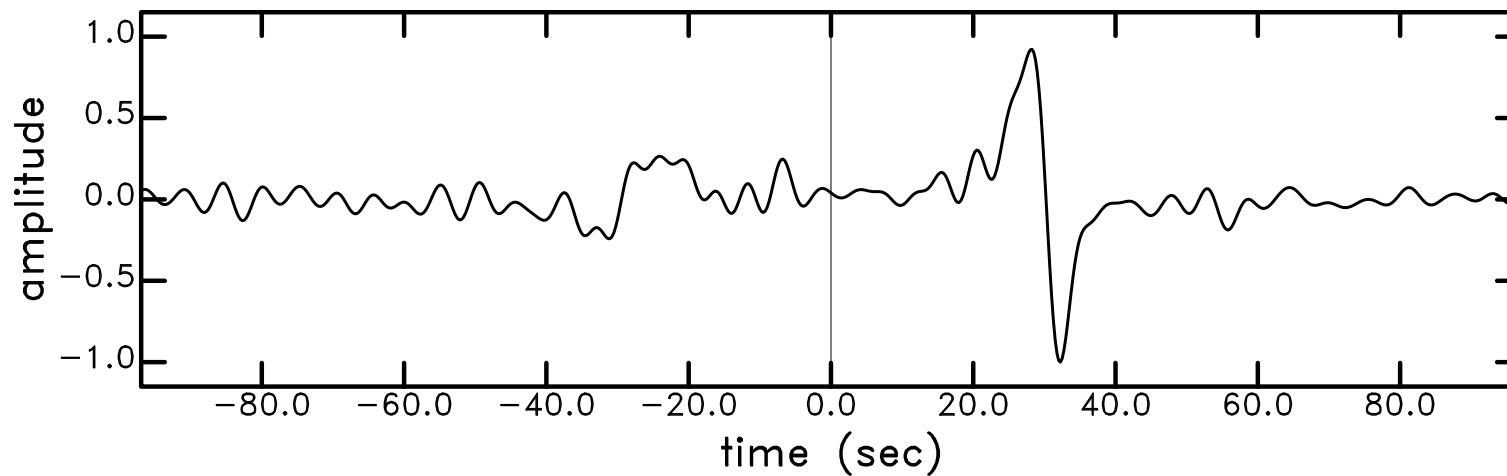
# Spectrum of cross-correlation function



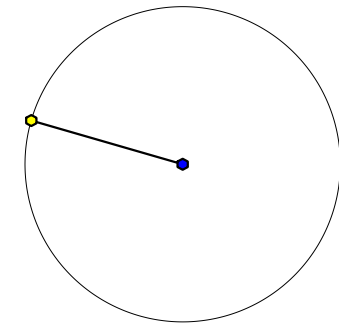
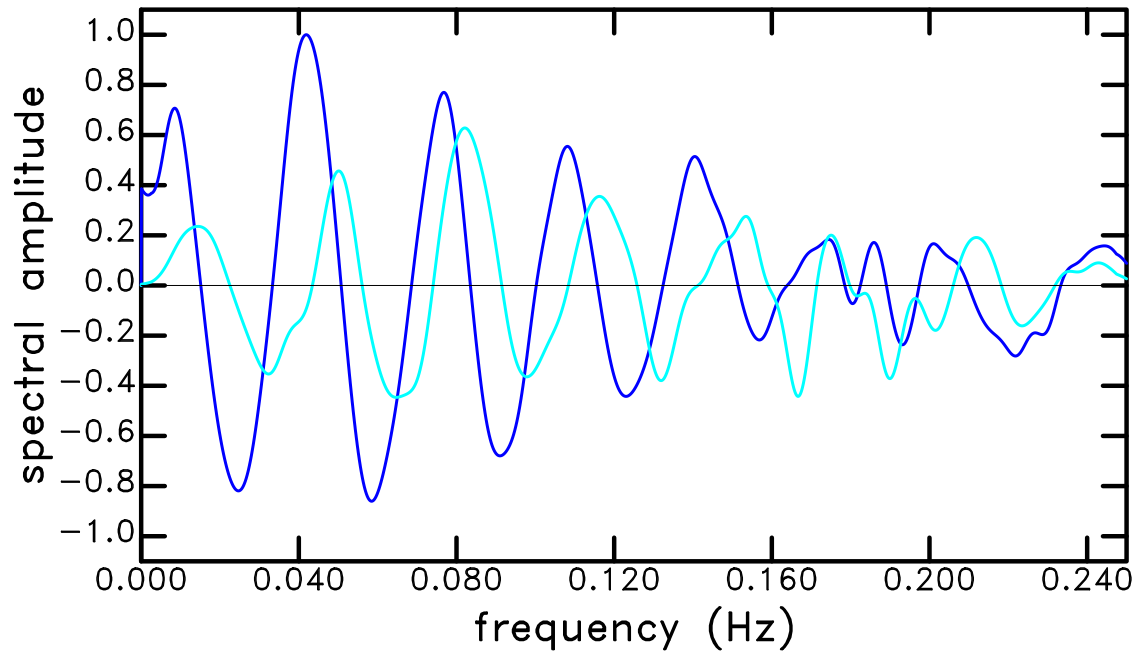
# Real data



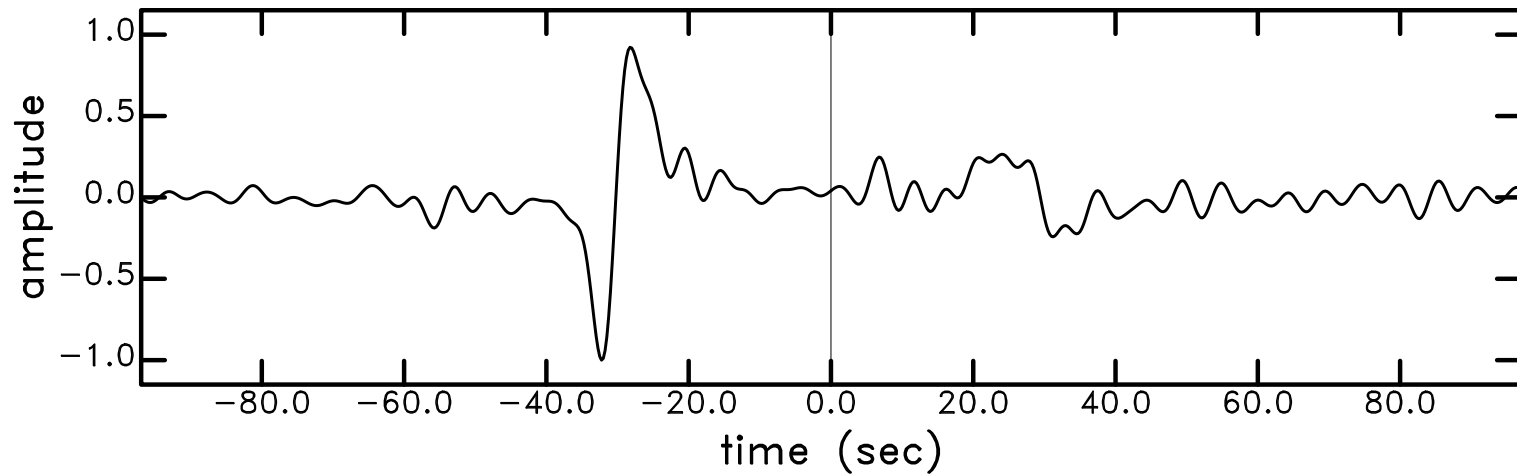
109C-TA - IKP-CI  
Latitude: 32.89  
Longitude: -117.11  
Distance: 96.96  
Azimuth: 105.58  
Records: 2133  
Max. Coh.: 508.7  
Component: 1



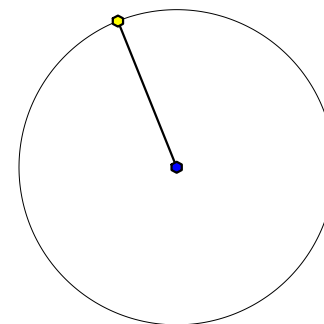
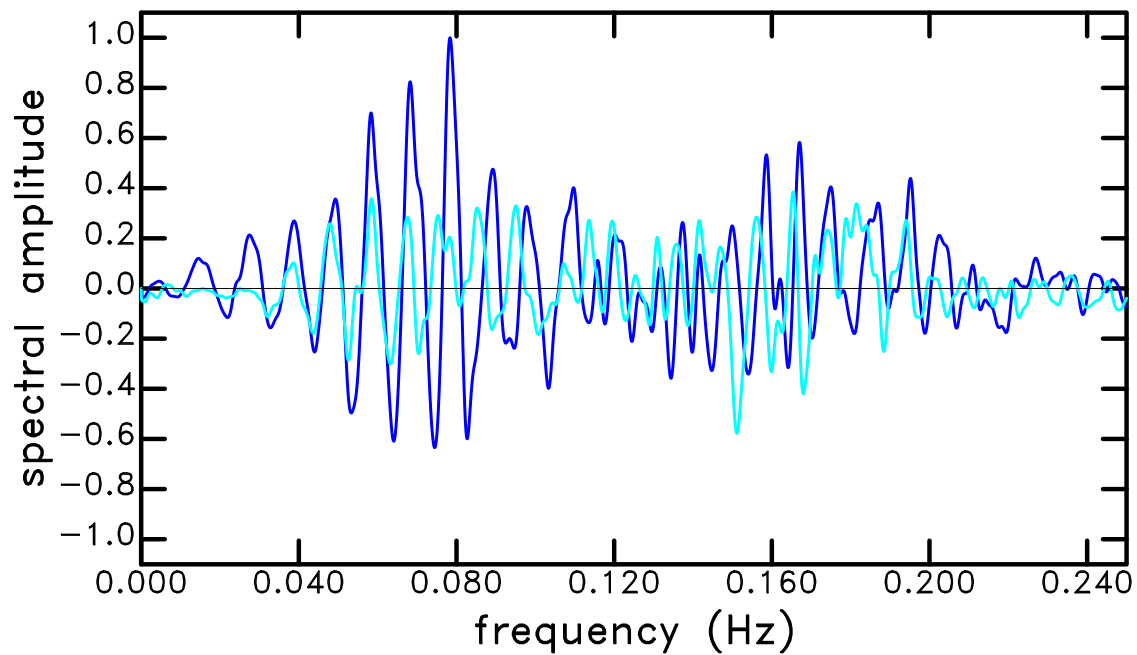
# Real data, reversed



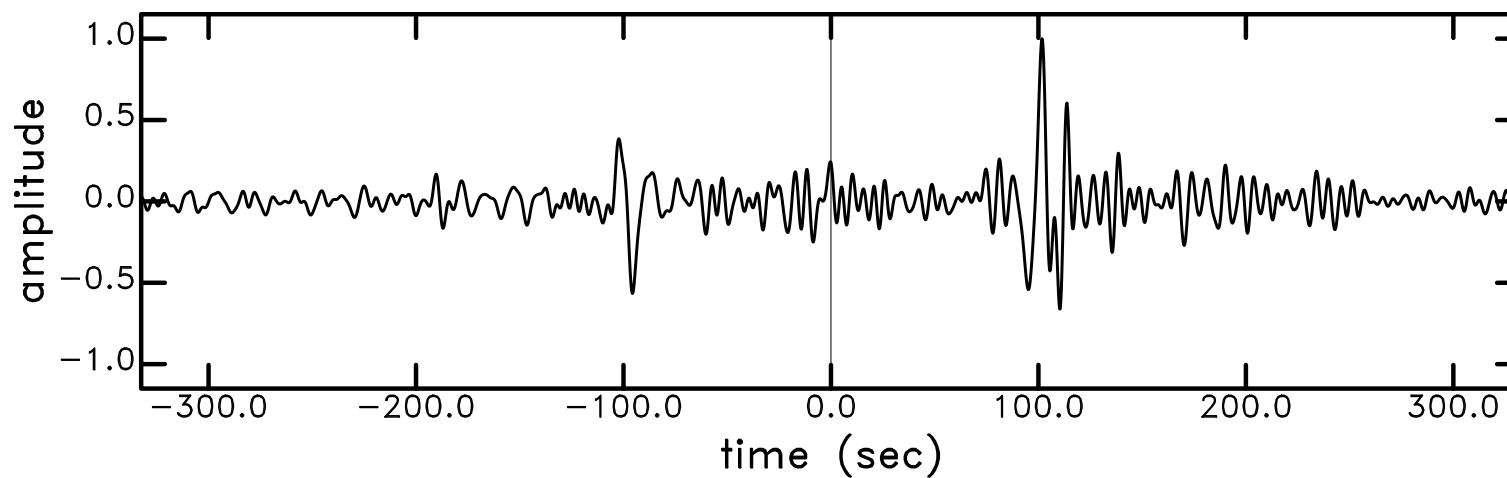
IKP-CI - 109C-TA  
Latitude: 32.65  
Longitude: -116.11  
Distance: 96.96  
Azimuth: 286.12  
Records: 2133  
Max. Coh.: 508.7  
Component: 1



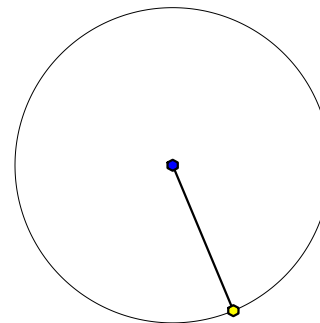
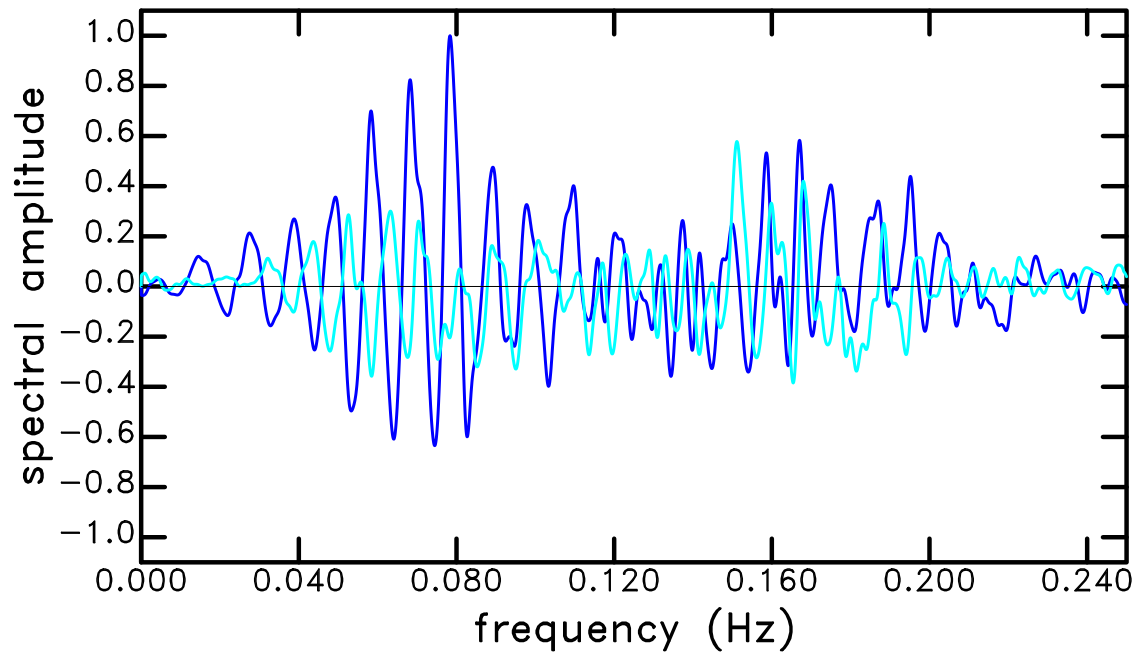
# Love waves



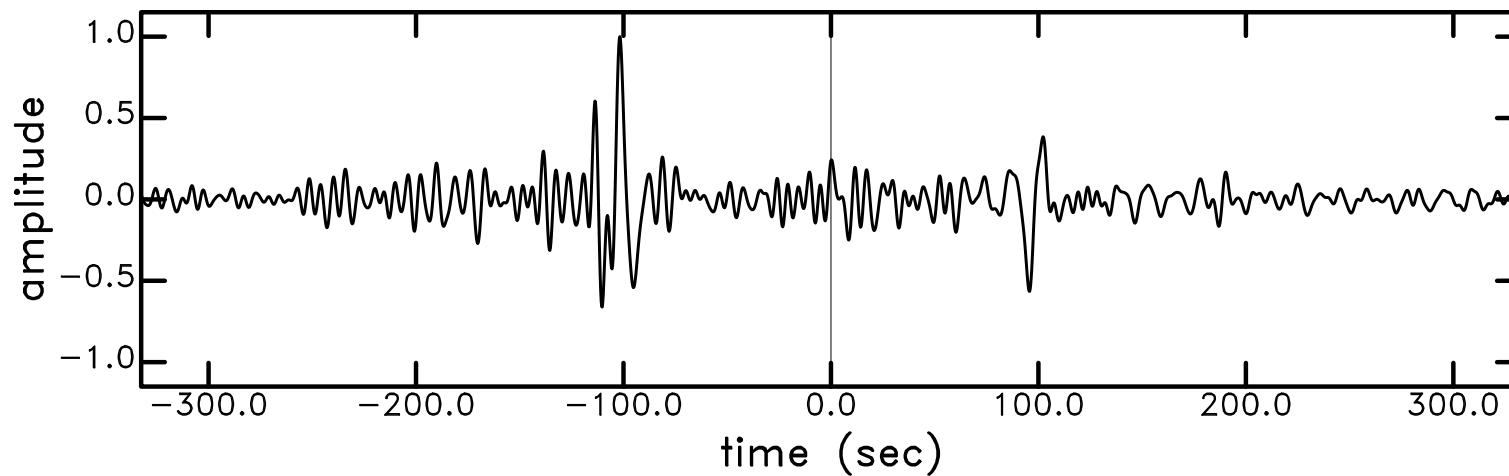
109C-TA - ISA-CI  
Latitude: 32.89  
Longitude: -117.11  
Distance: 332.48  
Azimuth: 338.10  
Records:12672  
Max. Coh.:1699.0  
Component: 5



# Love waves, reversed



ISA-CI - 109C-TA  
Latitude: 35.66  
Longitude: -118.47  
Distance: 332.48  
Azimuth: 157.33  
Records:12672  
Max. Coh.:1699.0  
Component: 5



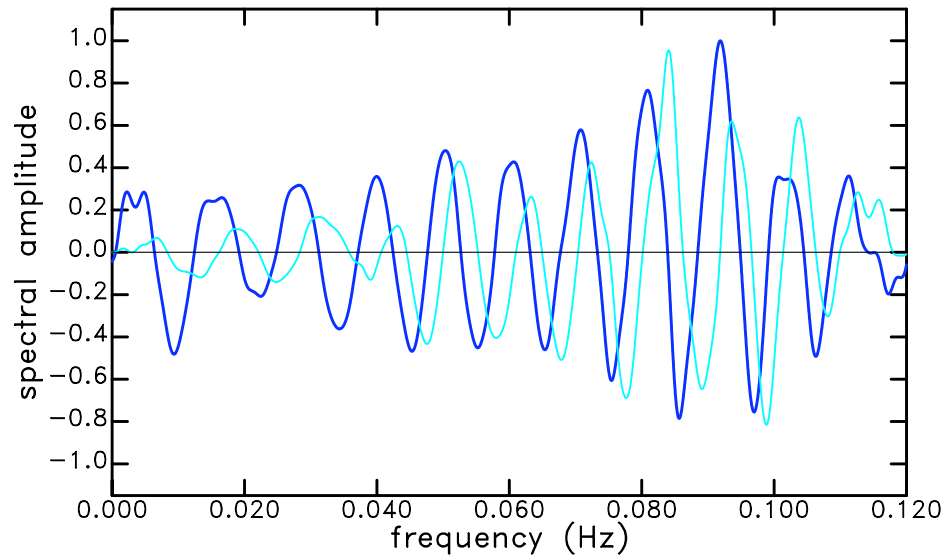
$$\bar{\rho}(r, \omega_0) = J_0 \left( \frac{\omega_0}{c(\omega_0)} r \right)$$

“This formula clearly indicates that if one measures  $\bar{\rho}(r, \omega_0)$  for a certain  $r$  and for various  $\omega_0$ 's, he can obtain the function  $c(\omega_0)$ , i.e., the dispersion curve of the wave for the corresponding range of frequency  $\omega_0$ ”.

**Aki, 1957**

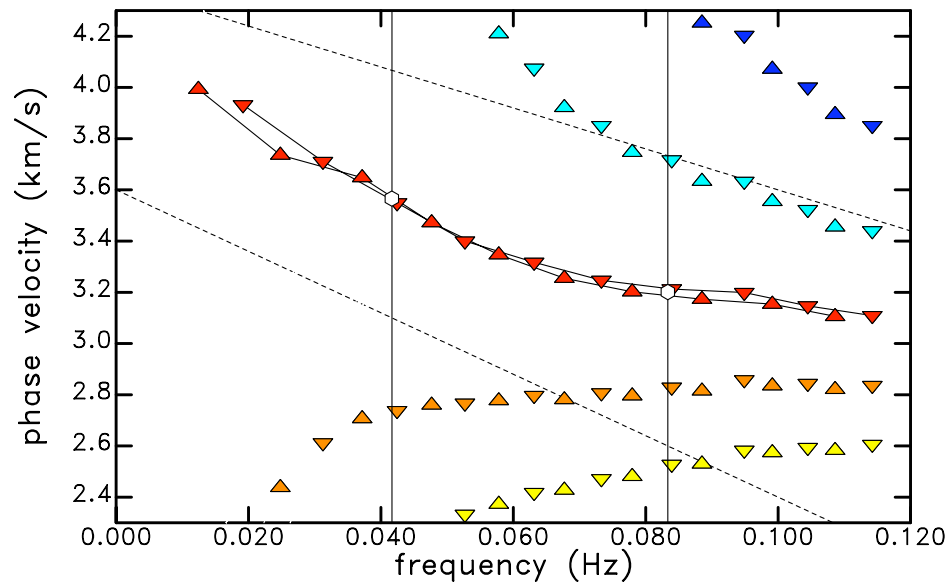
(made fashionable again by Ekström, Abers, and Webb, 2009)

# Matching zero crossings for dispersion



D07A-B04A  
282 km

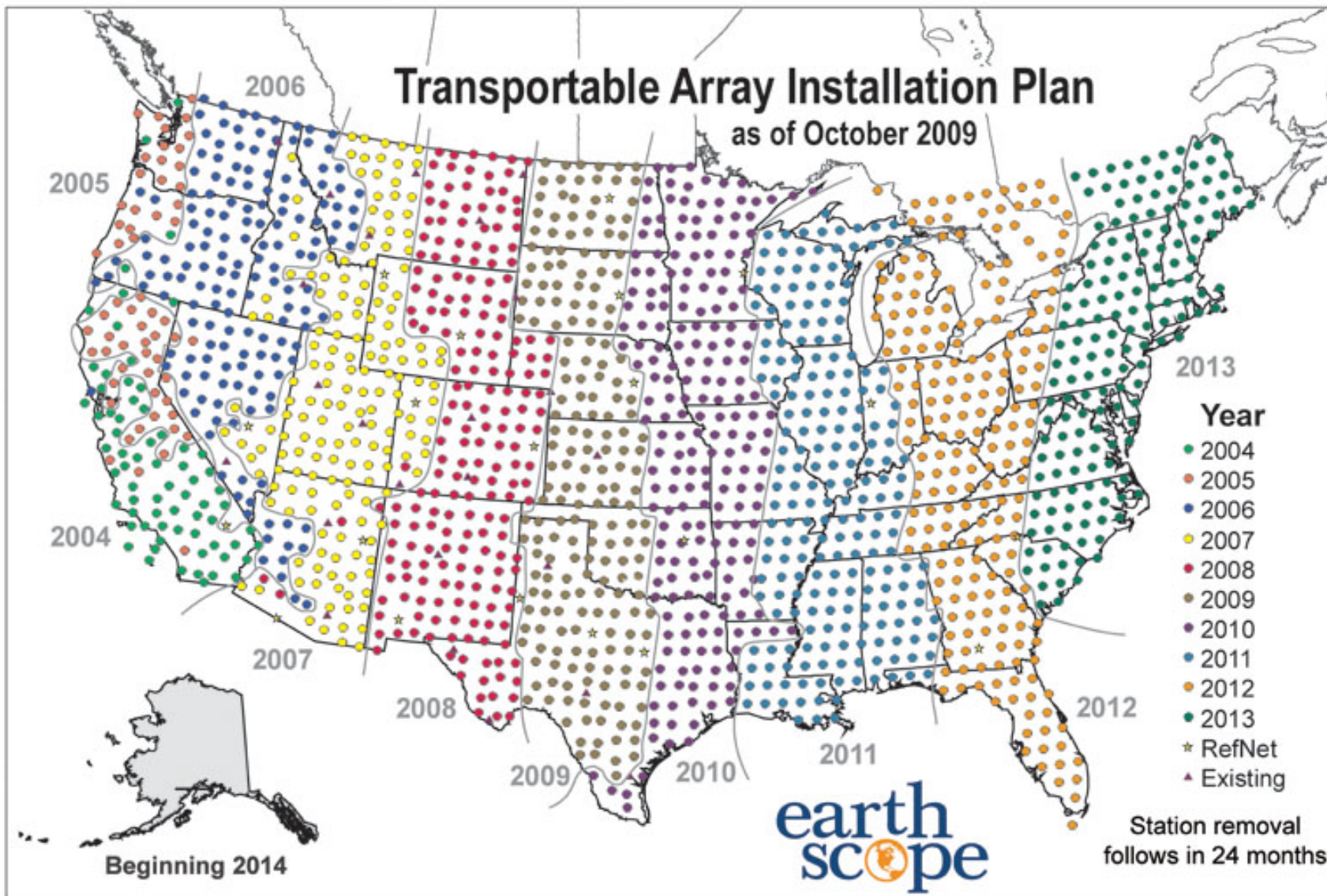
$$c(\omega_n) = \frac{\omega_n r}{Z_n}$$



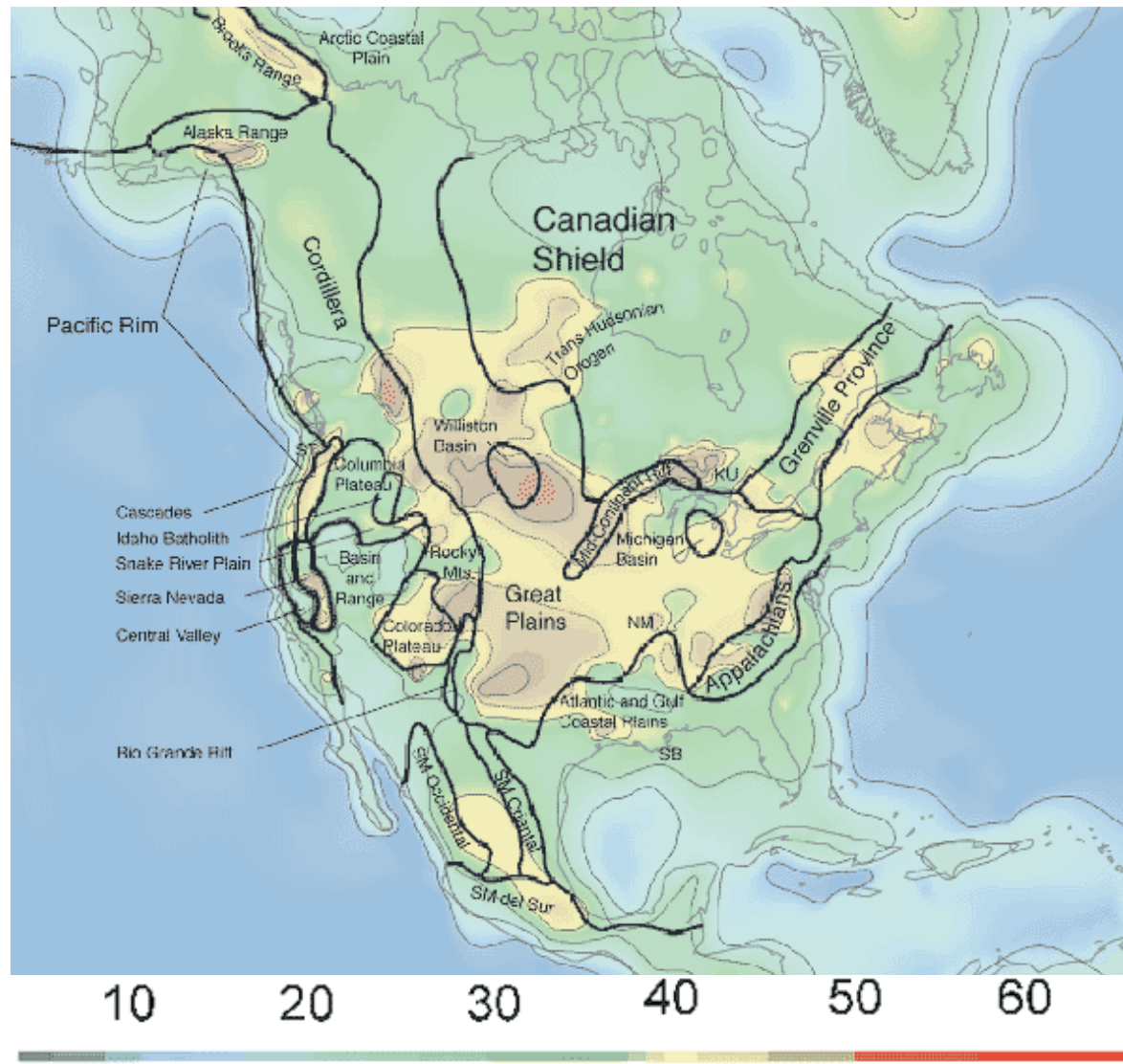


Some results from processing the  
USArray data 200601-201204

# Transportable Array Installation Plan as of October 2009



# The crust of North America

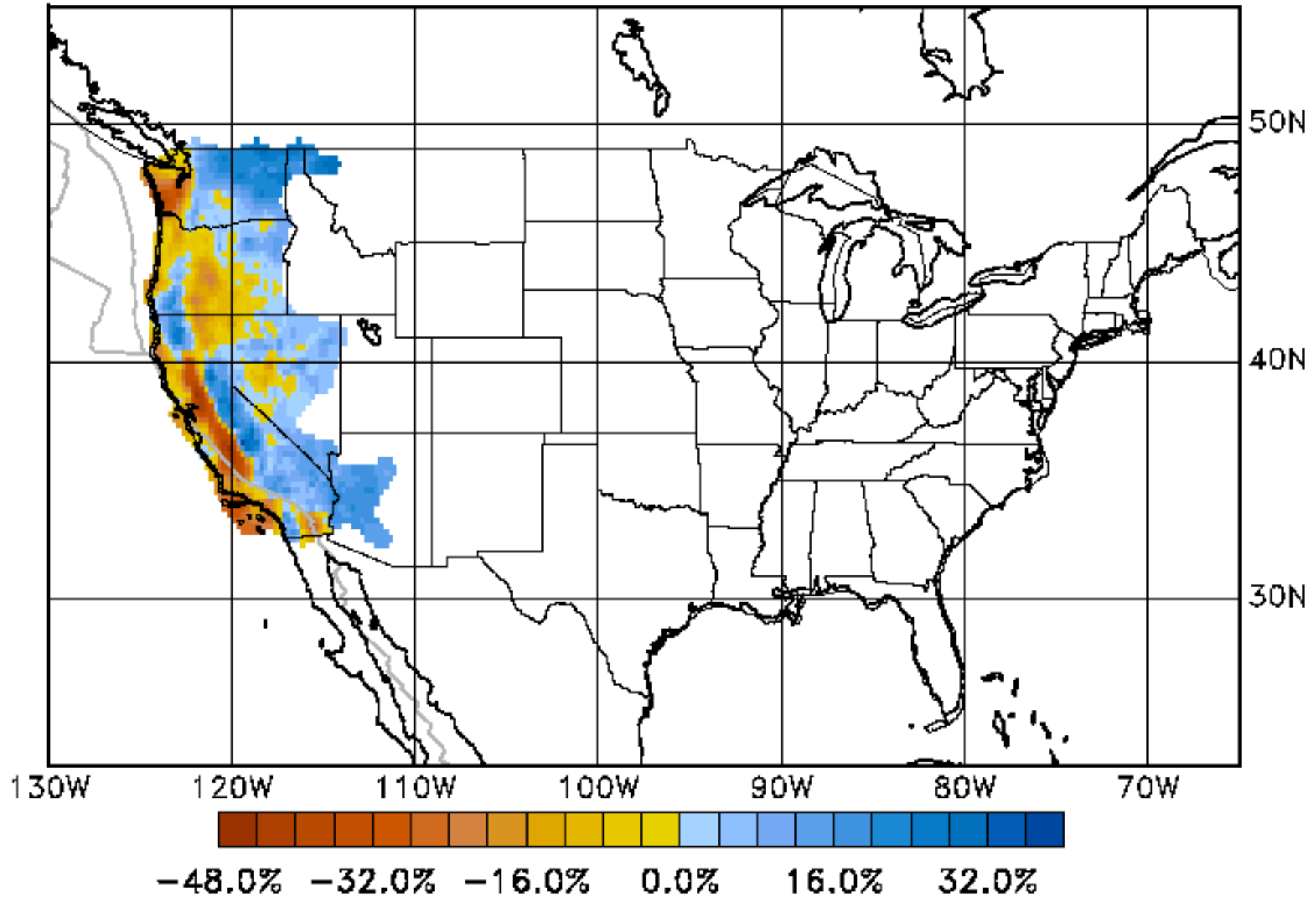


Chulick and Mooney, 2002

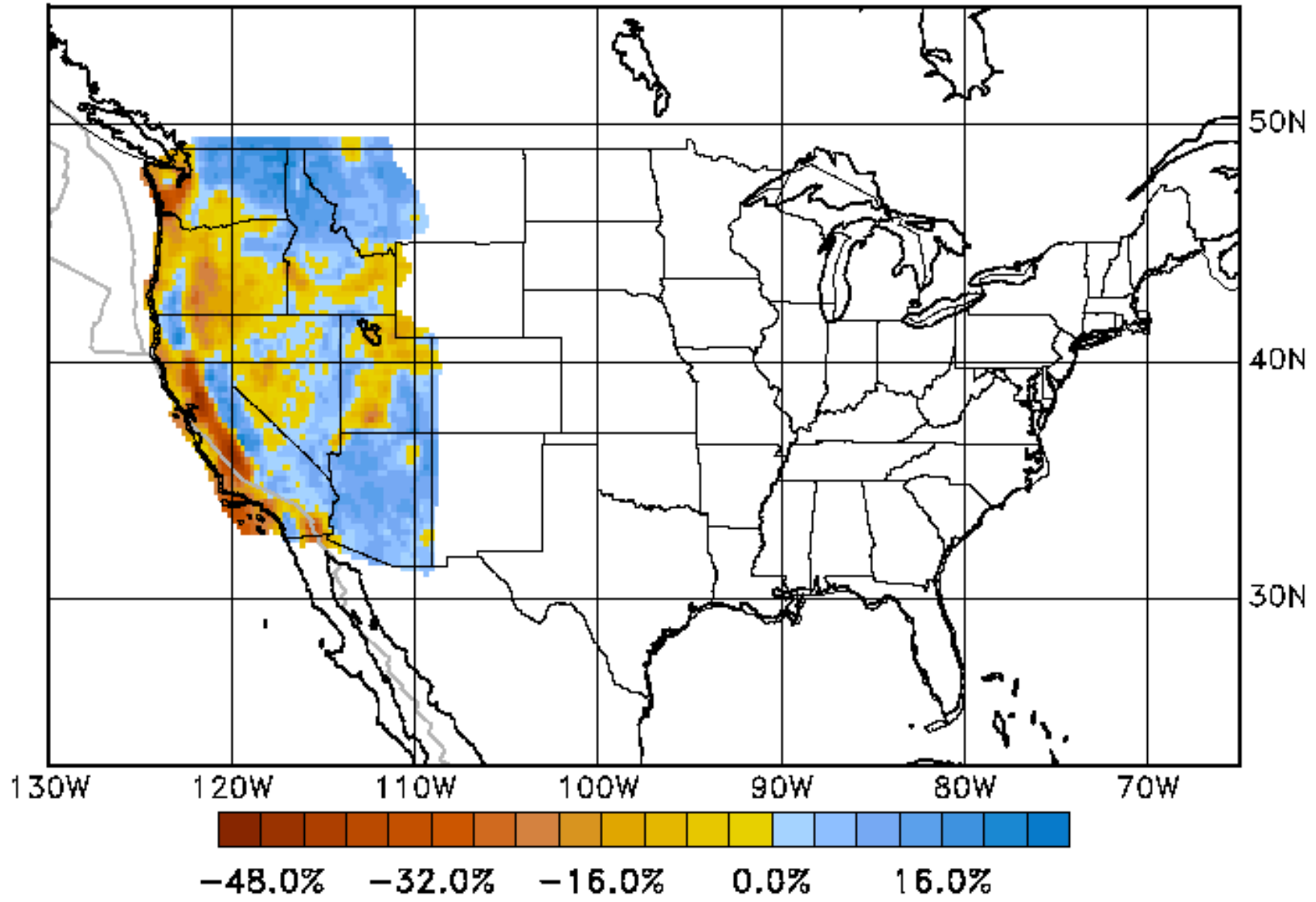
## Recipe for success:

1. Correlate continuous recorded signals at all pairs of USArray stations in 4-h windows (note - this is a big calculation)
2. Stack all correlation functions for each pair
3. Determine zero crossings of stacked cross-correlation spectra
4. Determine phase velocities using Aki's formula
5. Invert phase-velocity observations to determine phase-velocity maps

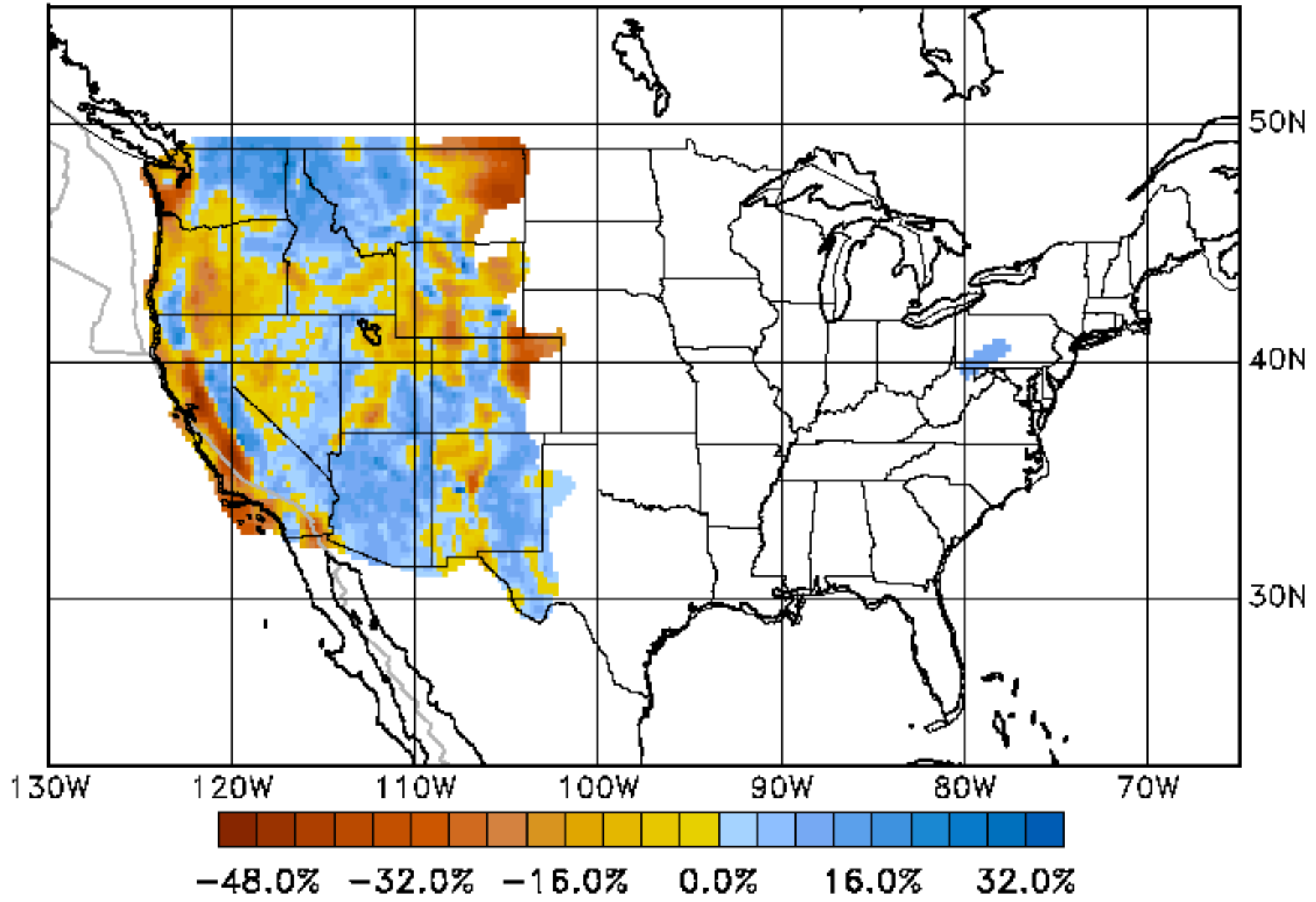
L005.0612 bo.pix Love waves, 5 seconds period



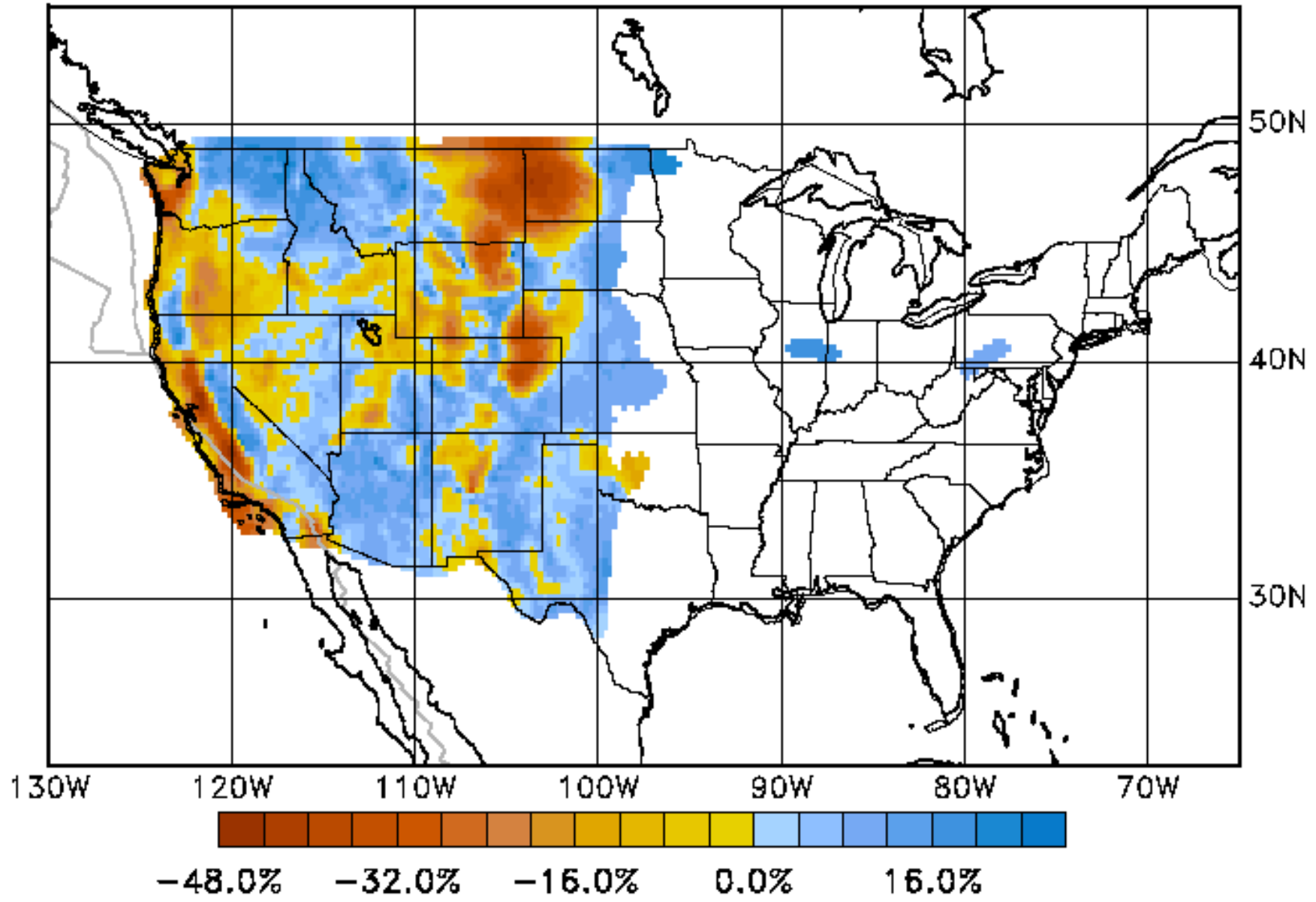
L005.0712 bo.pix Love waves, 5 seconds period



L005.0812 bo.pix Love waves, 5 seconds period

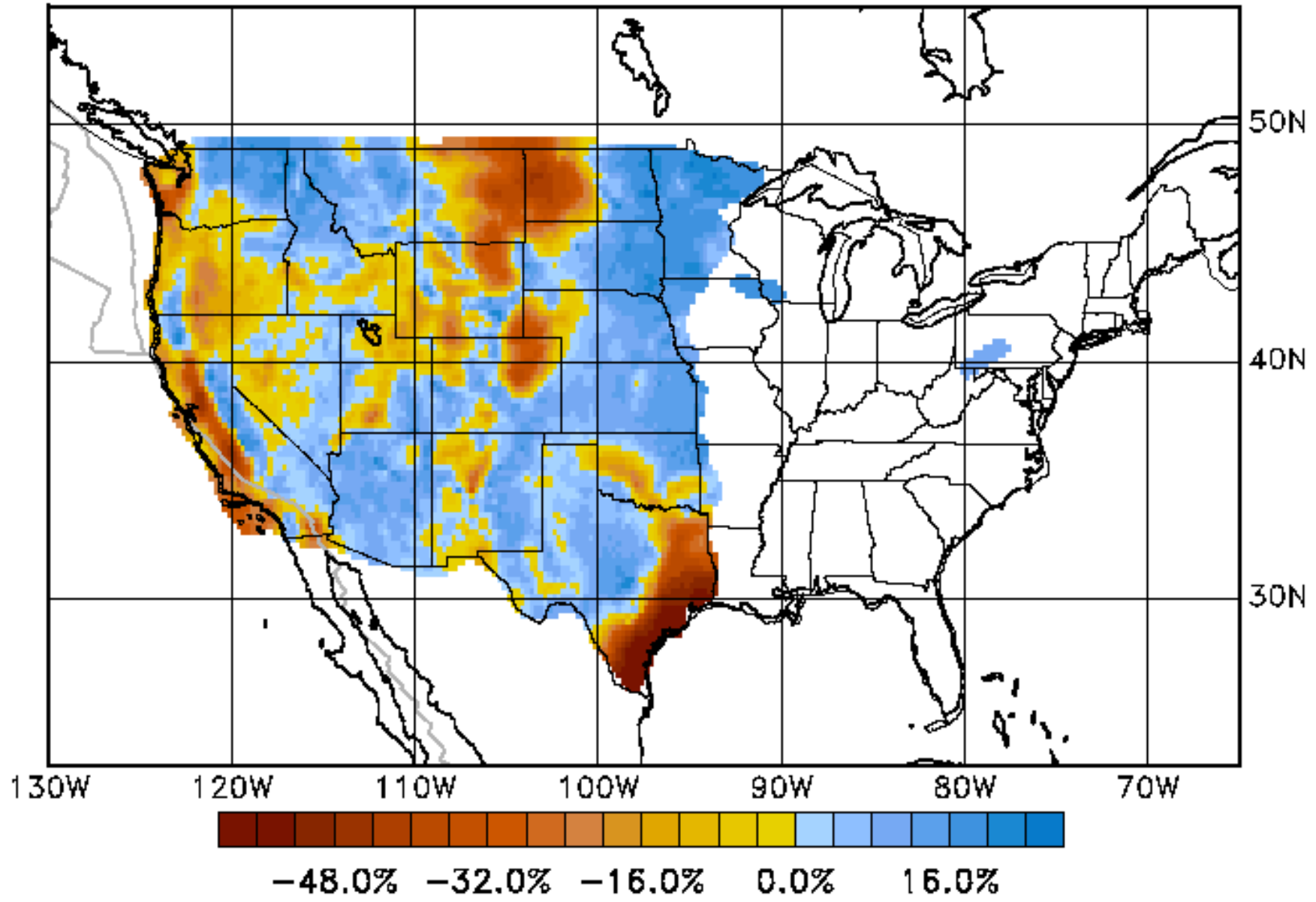


L005.0912 bo.pix Love waves, 5 seconds period

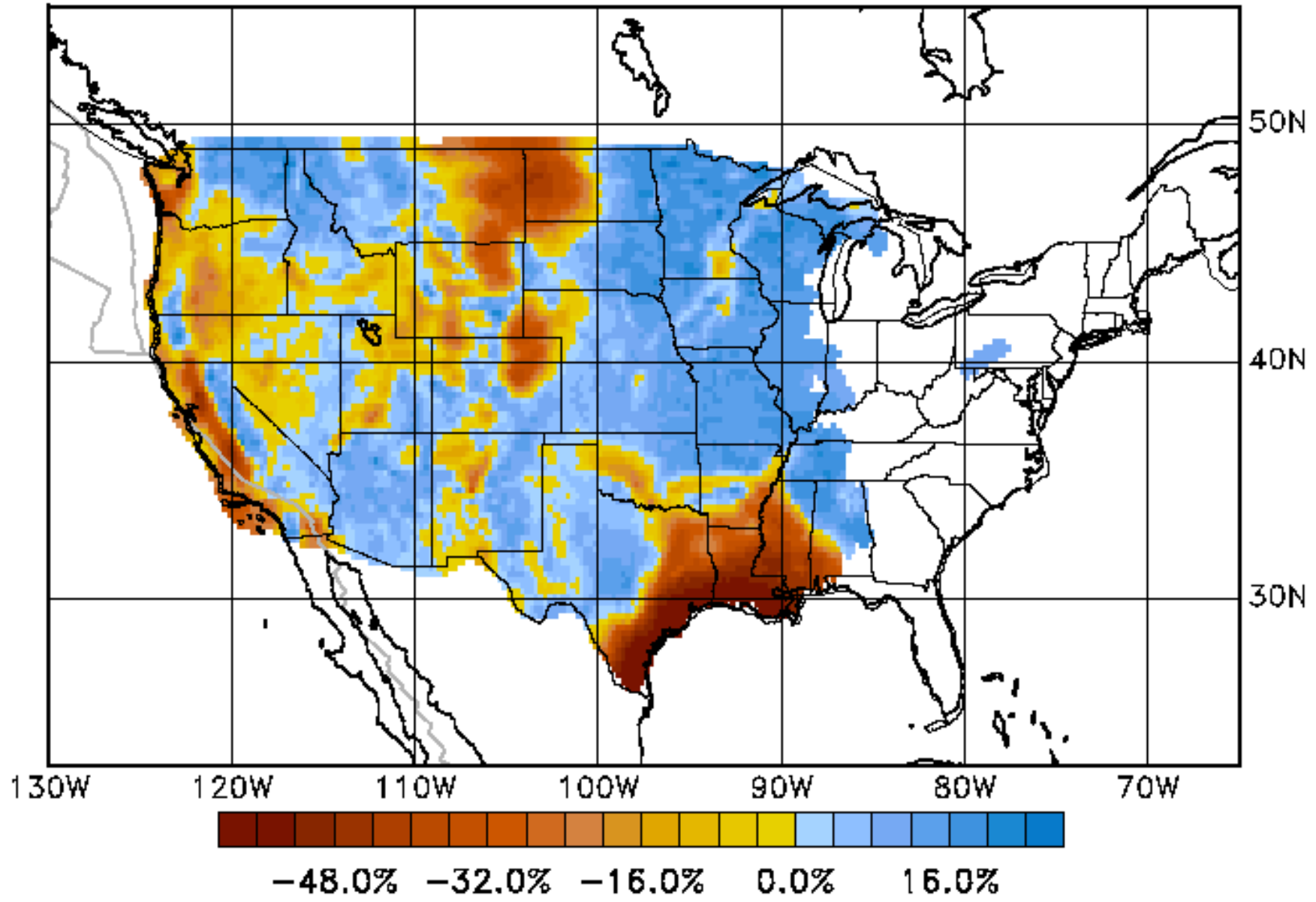




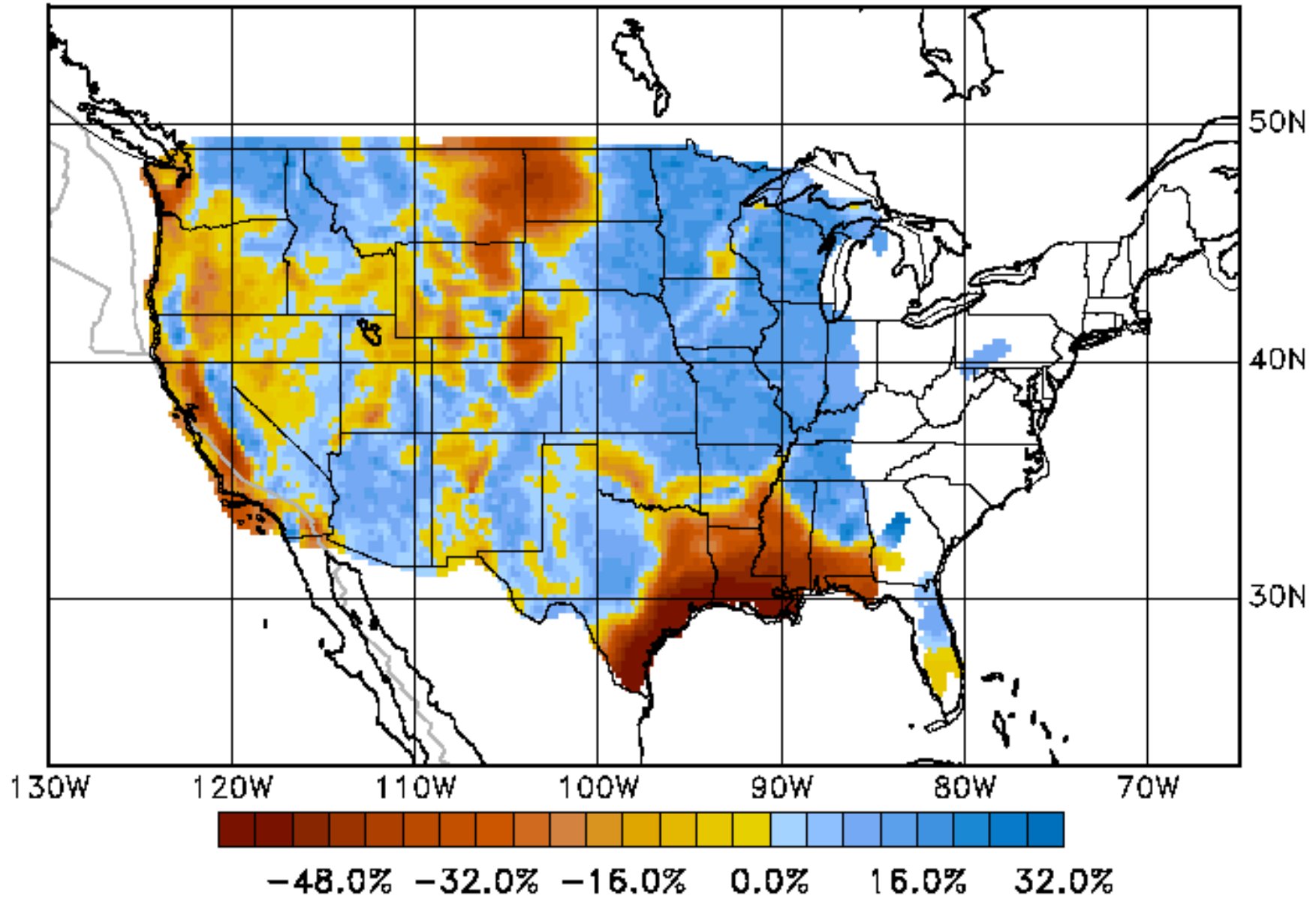
L005.1012 bo.pix Love waves, 5 seconds period



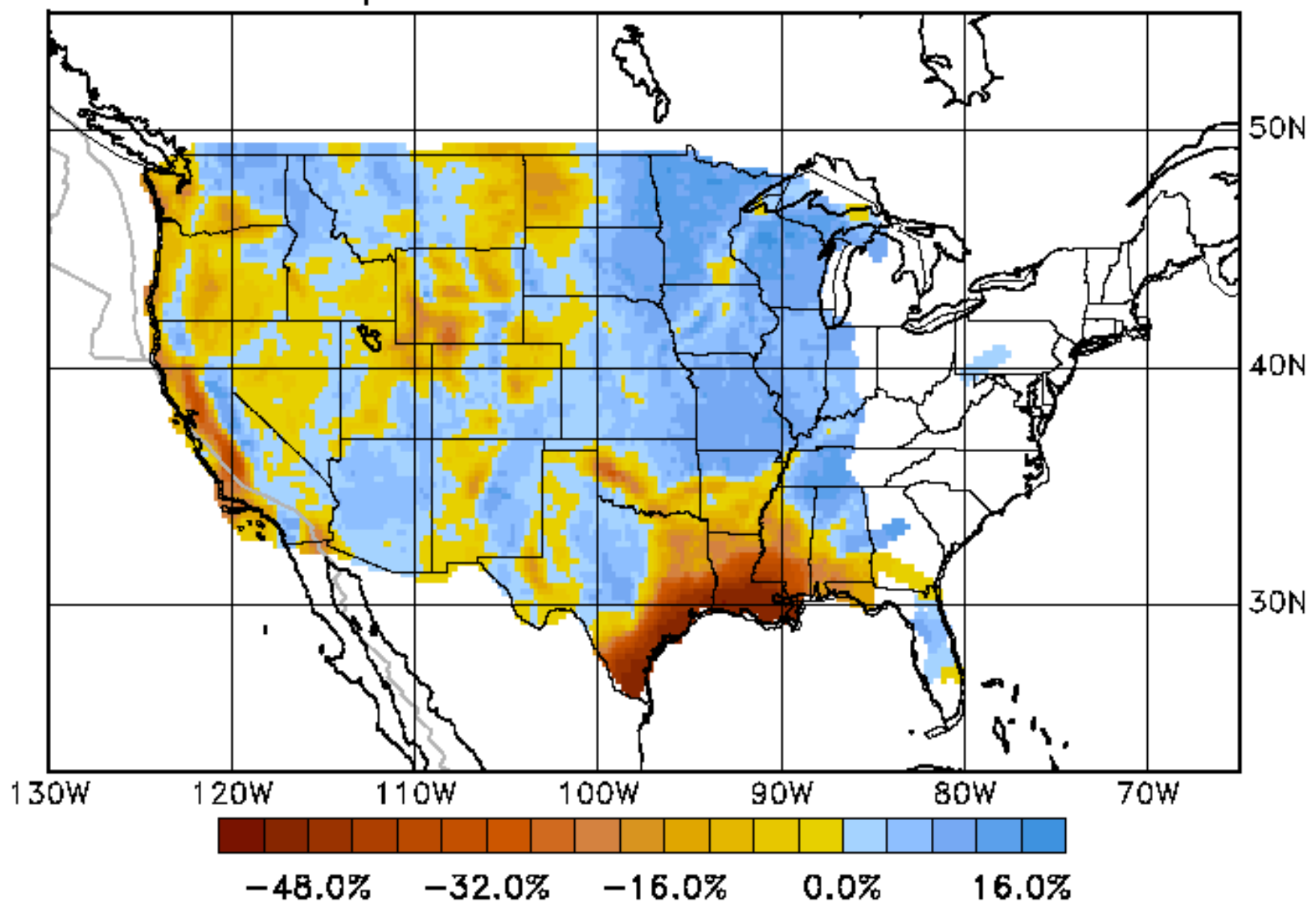
L005.1112 bo.pix Love waves, 5 seconds period



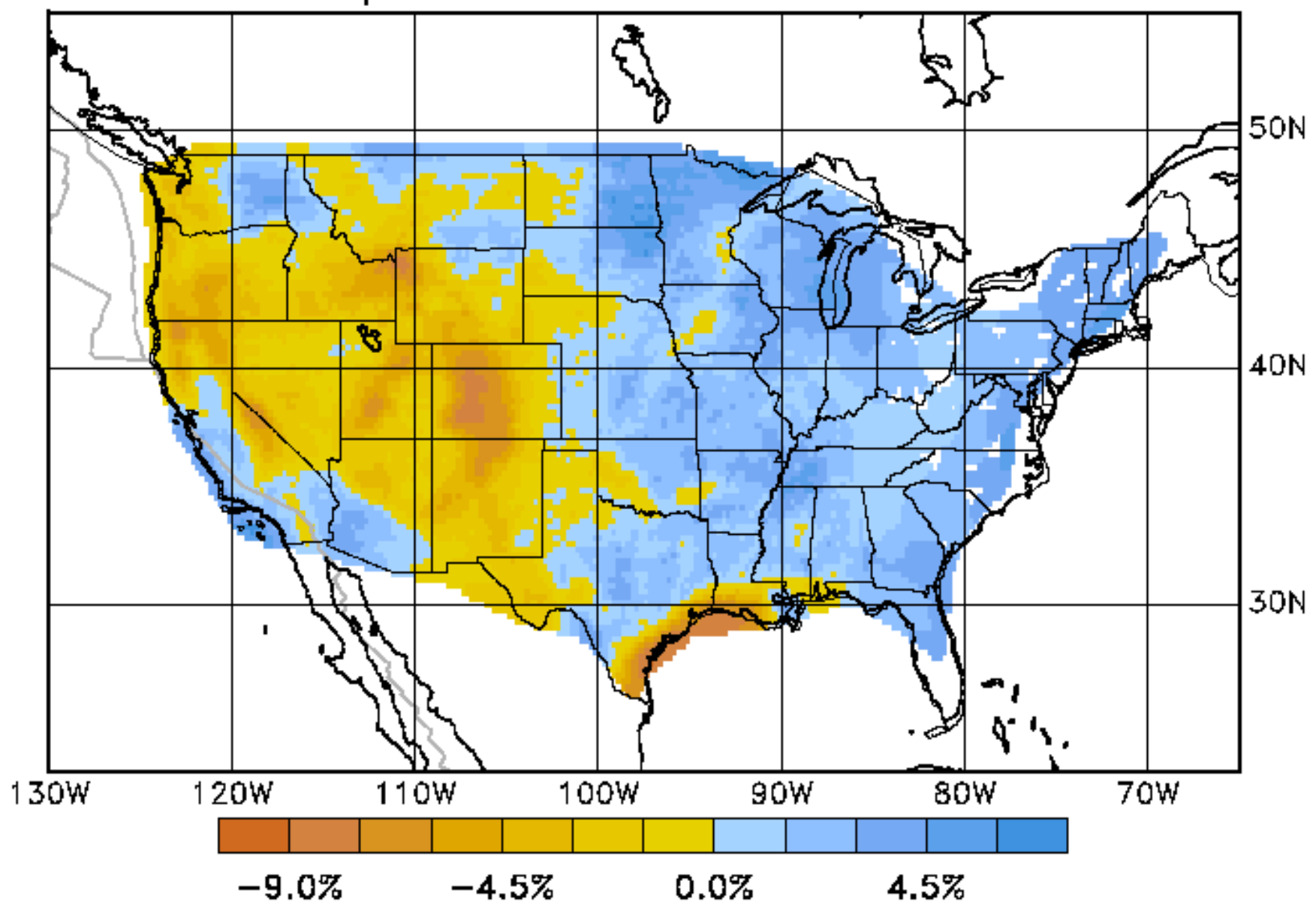
L005.1204 bo.pix Love waves, 5 seconds period



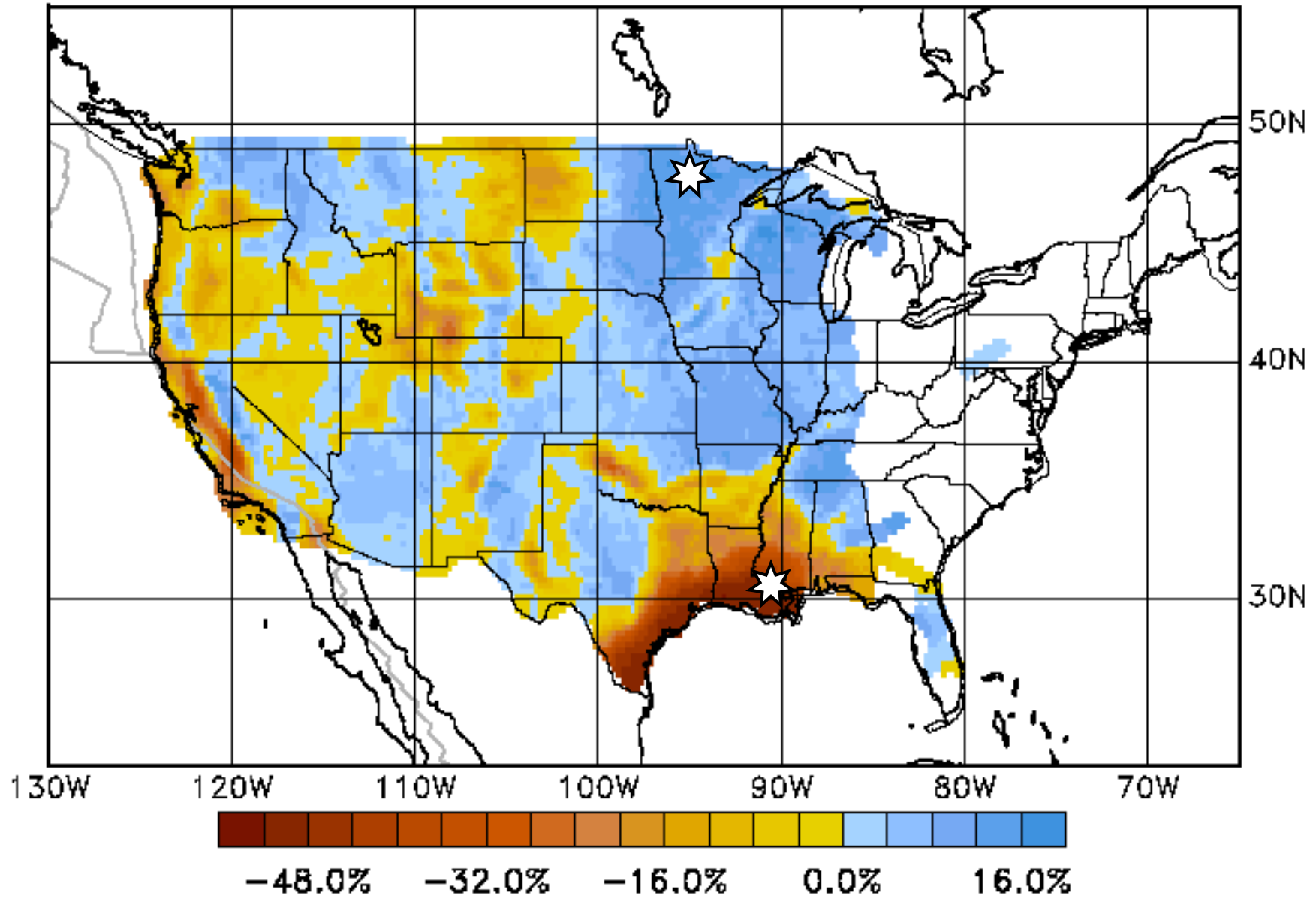
R005.1204 bo.pix **Rayleigh waves, 5 sec period**



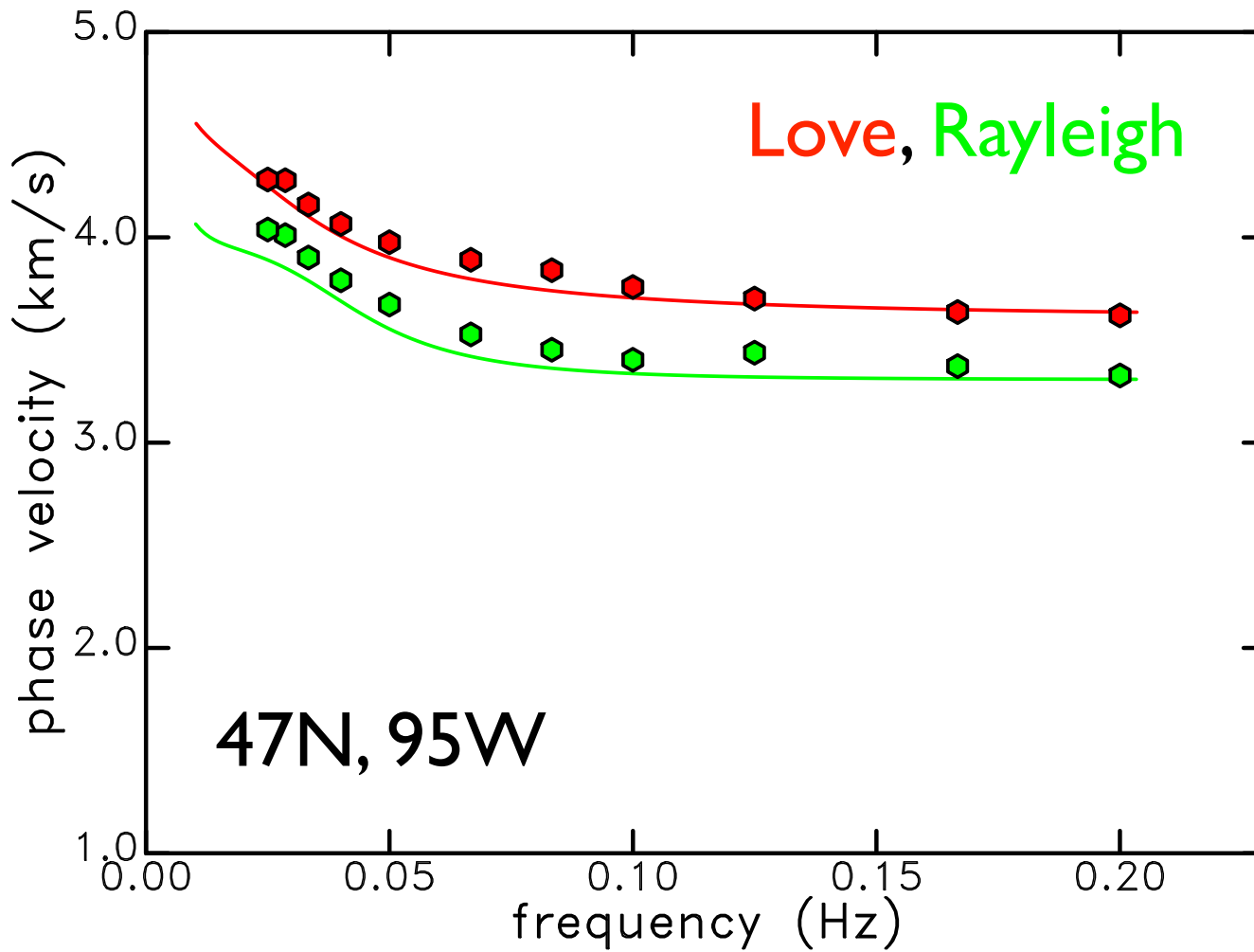
# R025.1204 bo.pix Rayleigh waves, 25 sec period



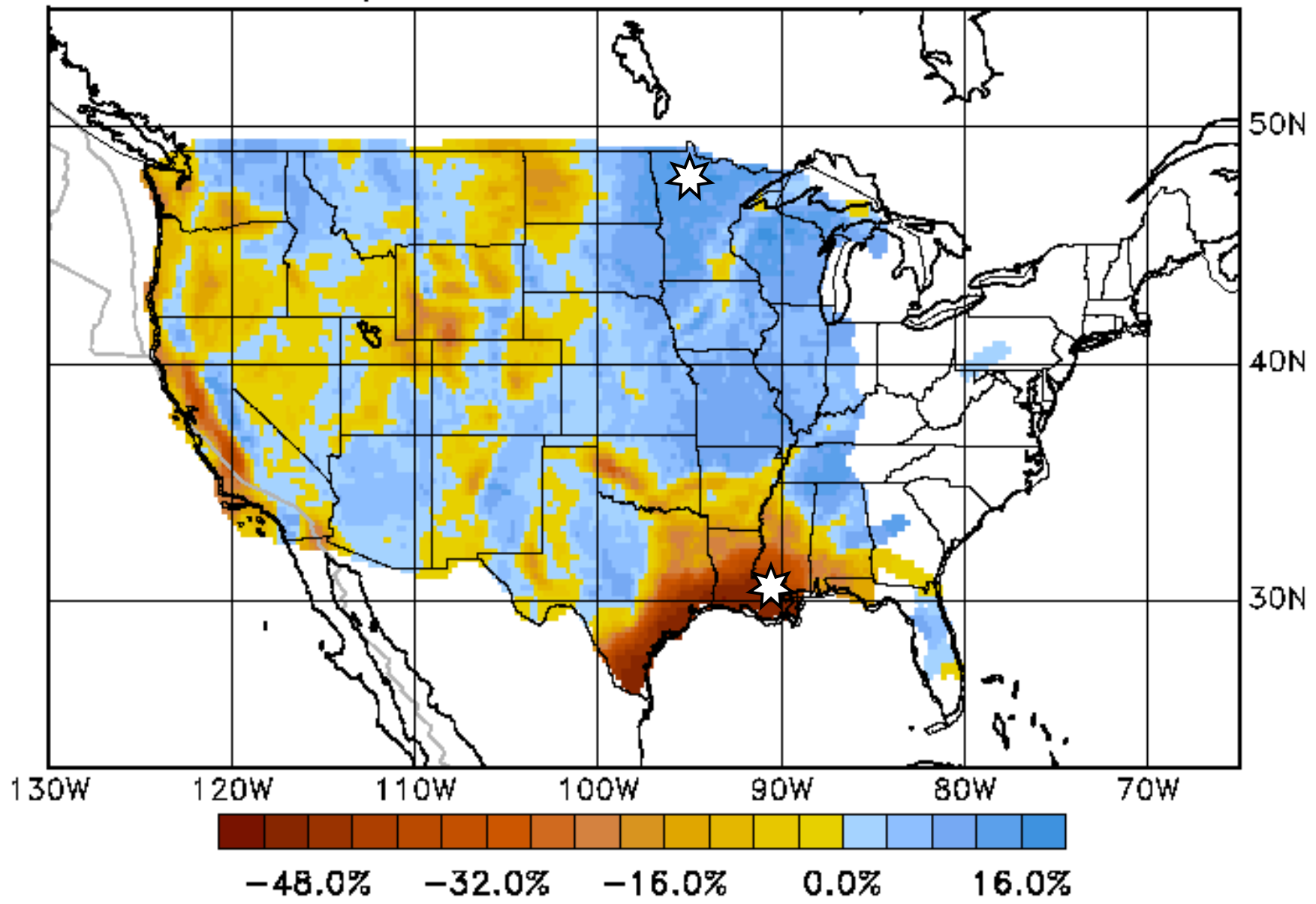
R005.1204 bo.pix



# Observations and CRUST 2.0

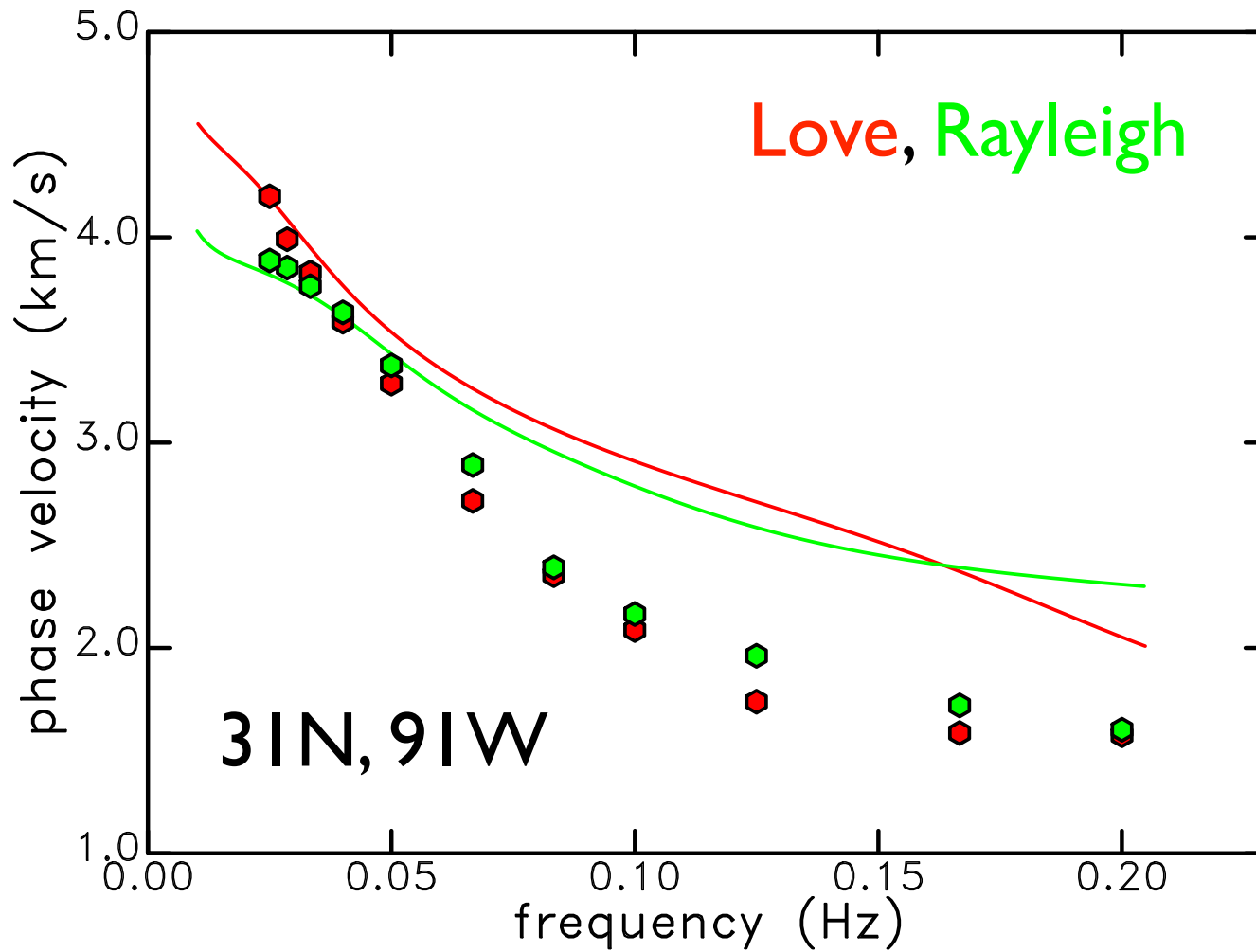


R005.1204 bo.pix





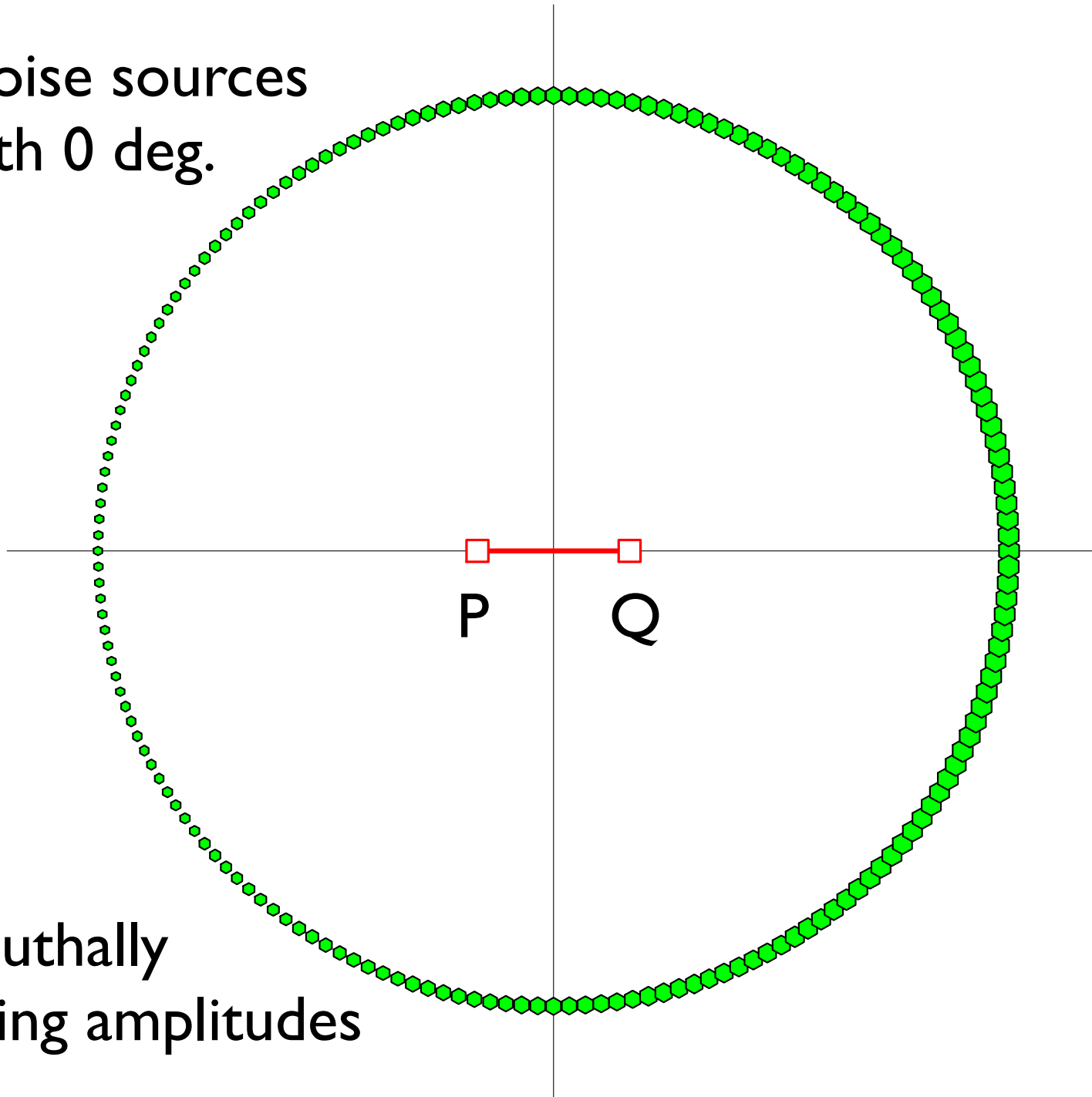
# Observations and CRUST 2.0



1. Noise tomography is a powerful tool to investigate shallow Earth structure using data from a regional network
2. There are different algorithms that are used -- Aki's method is perhaps the simplest
3. Noise tomography requires continuous data

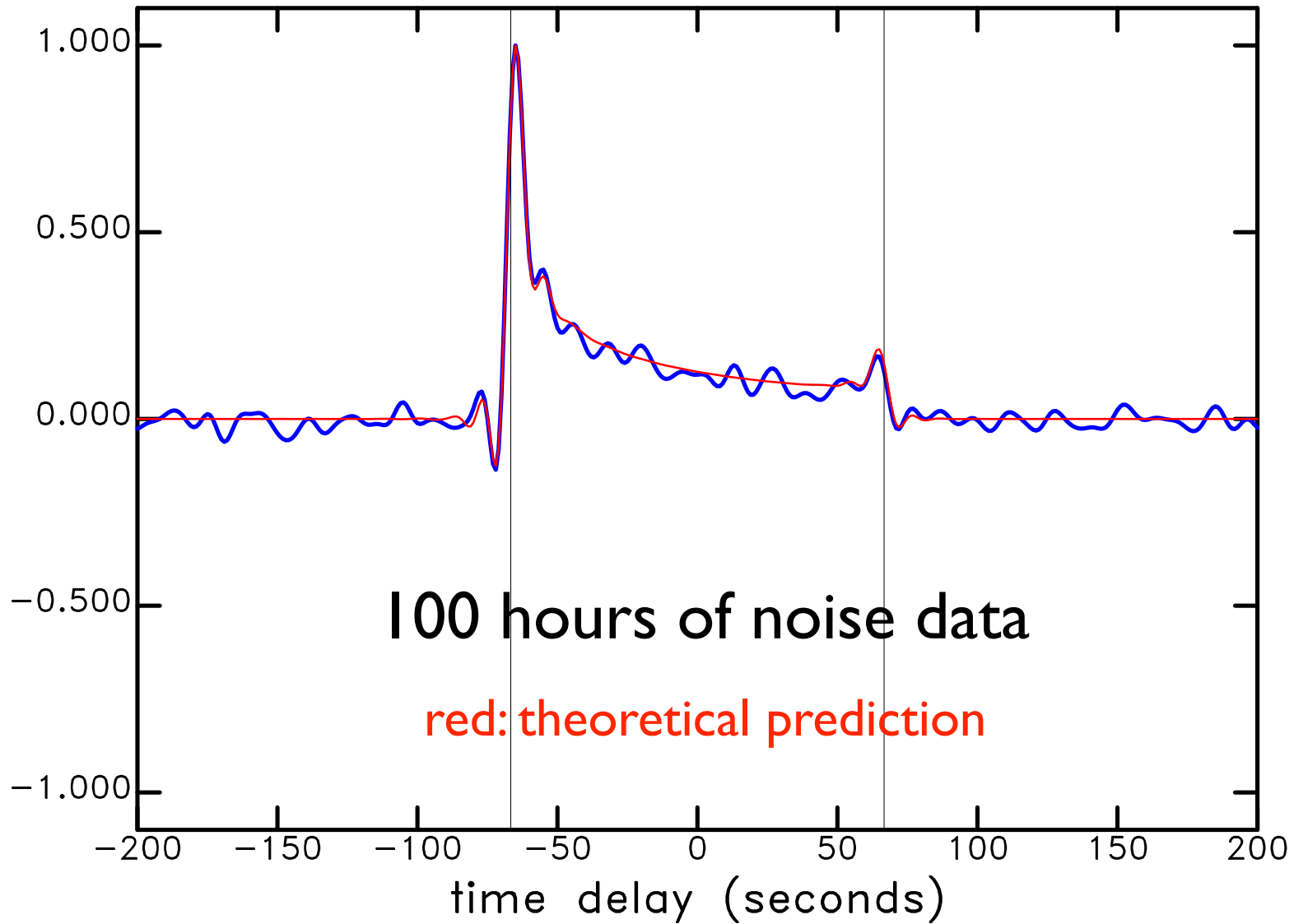


180 noise sources  
azimuth 0 deg.



azimuthally  
varying amplitudes

# Cross-correlation function, P and Q



# Spectrum of cross-correlation function

