



# Signal Processing for Underwater and Structural Acoustics

*CARGESE, September 2019*

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# COMMON PERCEPTIONS (Underwater Acoustics)

- ROBUST ACOUSTICS (MODELING ALWAYS WORKS)
- PASSIVE ACOUSTICS (MATCHED FIELD PROCESSING WORKS)
- VERY LOW SNR SIGNAL PROCESSING CAN BE ATTAINED WITH "EXOTIC" METHODS
- NOISE IS A NUISANCE TO BE OVERCOME
- FLUCTUATIONS LIMITS SIGNAL PROCESSING

# MY MOTIVATION

- ROBUST ACOUSTICS (MODELING ALWAYS WORKS)  
-AS LONG AS YOU DON'T COMPARE MODEL WITH DATA
- PASSIVE ACOUSTICS (MATCHED FIELD PROCESSING WORKS)-  
NOT REALLY, – THE CHALLENGE
- VERY LOW SNR SIGNAL PROCESSING -USUALLY NEVER  
WORKS -LATEST STUFF BREAKS DOWN AT SAME SNR AS  
CLASSICAL STUFF – THE CHALLENGE
- NOISE A NUISSANCE TO BE OVERCOME – CAN BE USED TO  
IMAGE OCEAN ENVIRONMENT AND STRUCTURES
- FLUCTUATIONS LIMITS SIGNAL PROCESSING -- BUT MAY BE  
USABLE - THE CHALLENGE

# OUTLINE

- **WHAT DOES SIGNAL PROCESSING GIVE YOU?**
- **(Some) UNDERWATER ACOUSTICS (UA)**
- **PASSIVE vs ACTIVE SIGNAL PROCESSING**
- **TYPES OF NOISE in UA**
- **RADIATING TARGETS**
- **AMBIENT NOISE "IMAGING"**
- **SCATTEERING , STRUCTURAL ACOUSTICS and RANDOM ENSONIFATION**



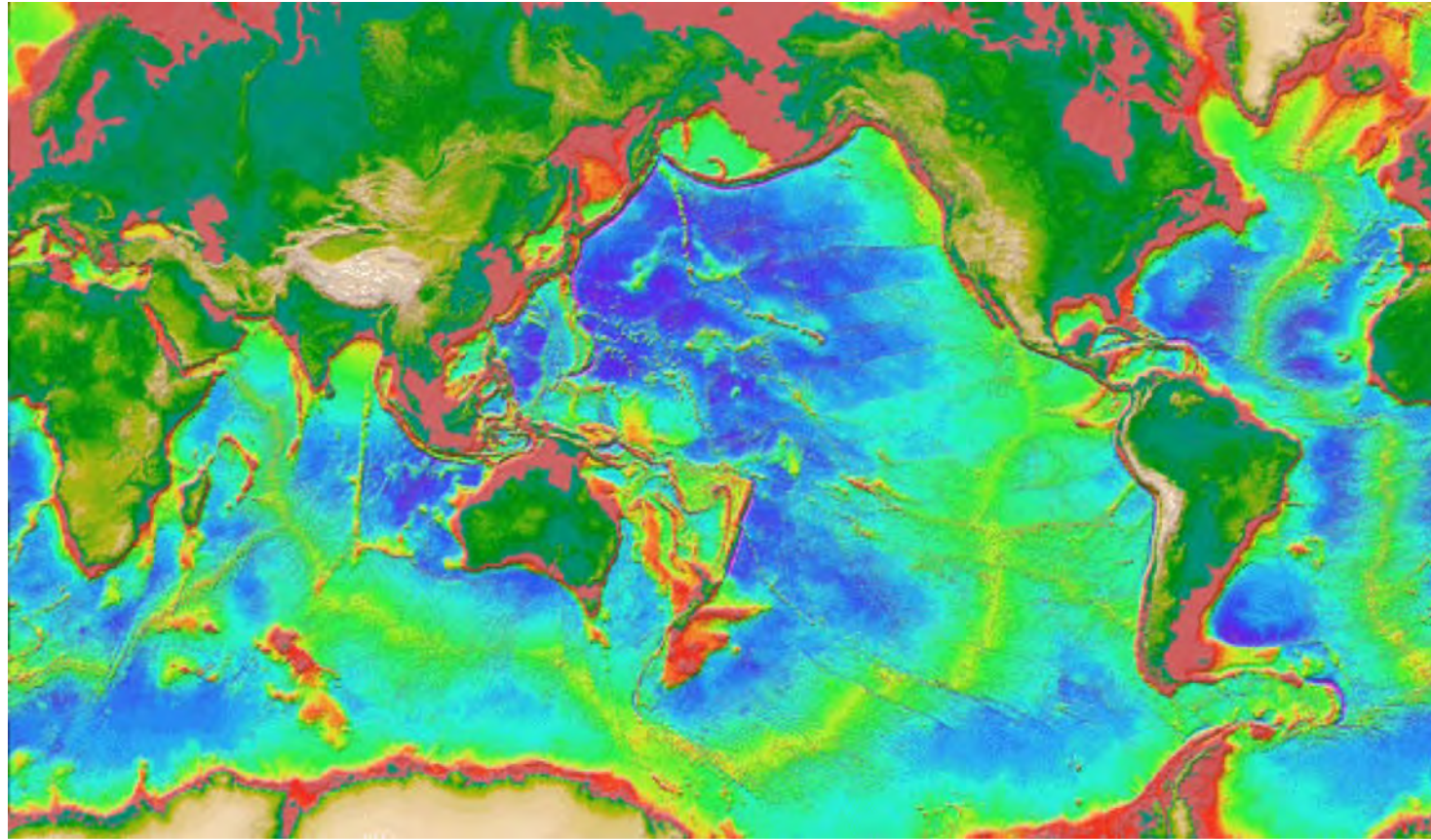
# Signal Processing Outcomes

- Information about “target” [DCLT]
  - Detection
  - Classification
  - Localization
  - Tracking

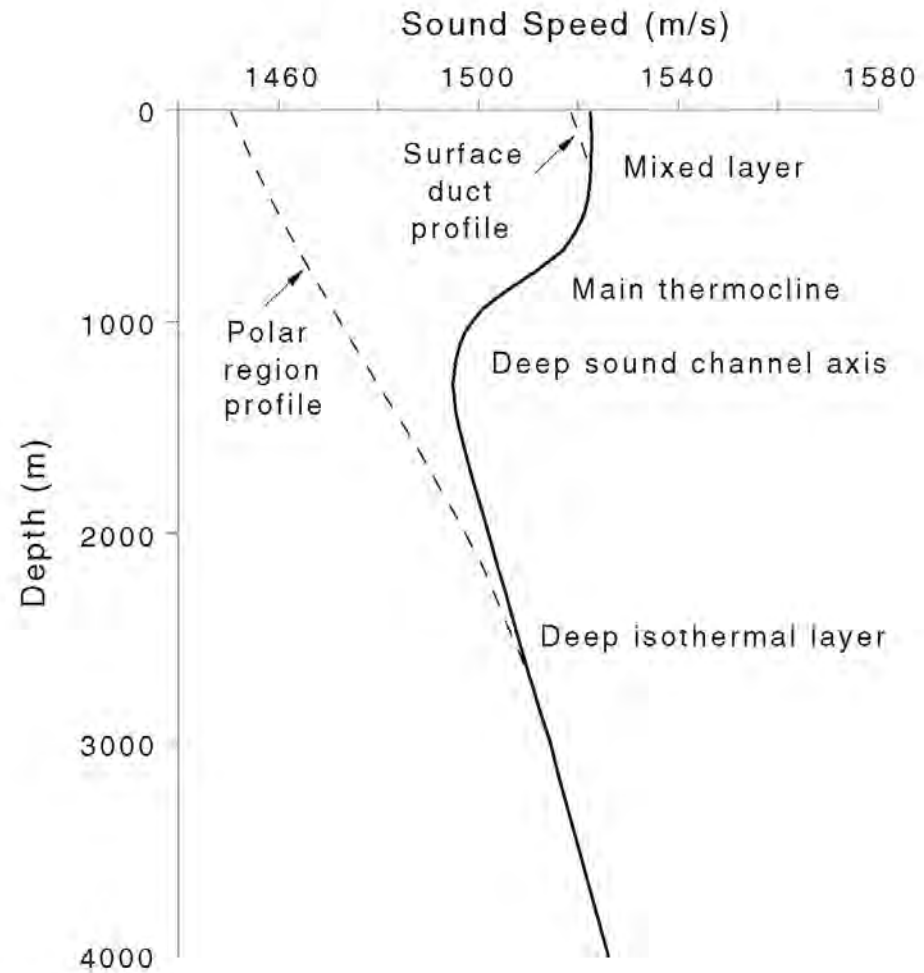
MOST CRITICAL ISSUE: **LOW SNR**

- Information about medium/object
  - Medium properties [Tomography, Structural Health Monitoring...]

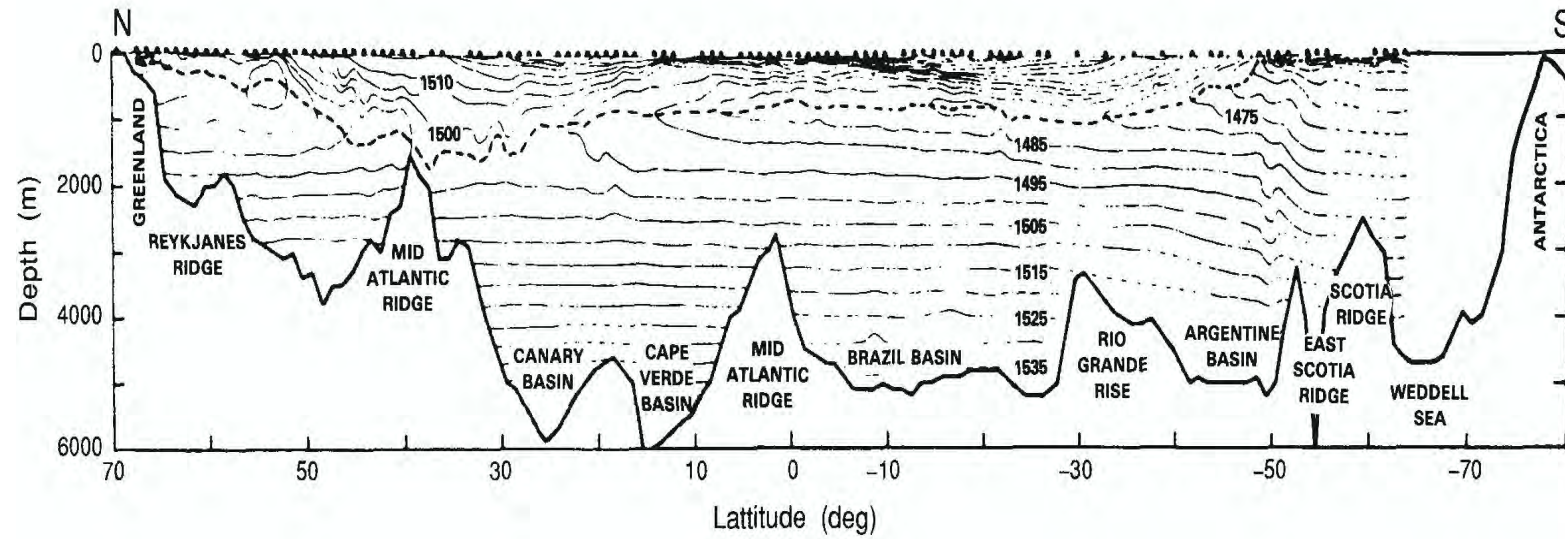
# ACOUSTICS IN THE OCEAN



# GENERIC SOUND SPEED STRUCTURE



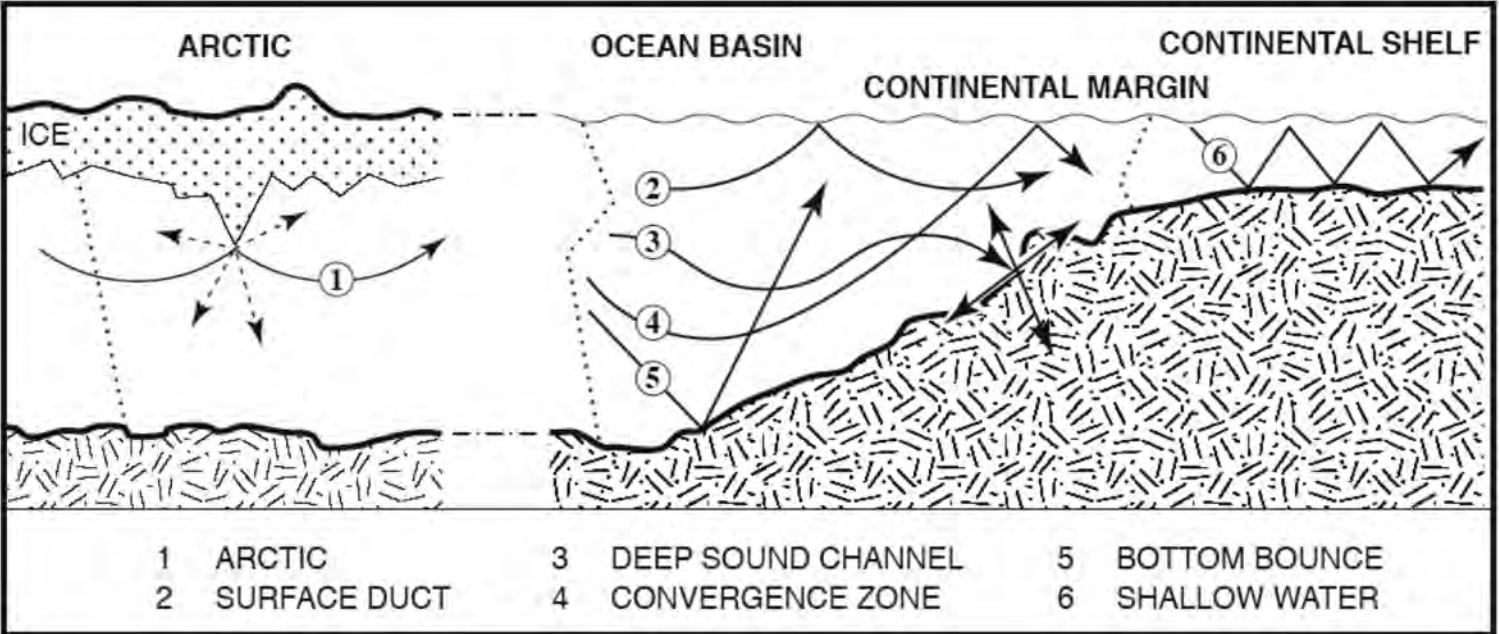
# GLOBAL SOUND SPEED STRUCTURE



SNELL'S LAW:

SOUND LIKES LOW  
SPEEDS

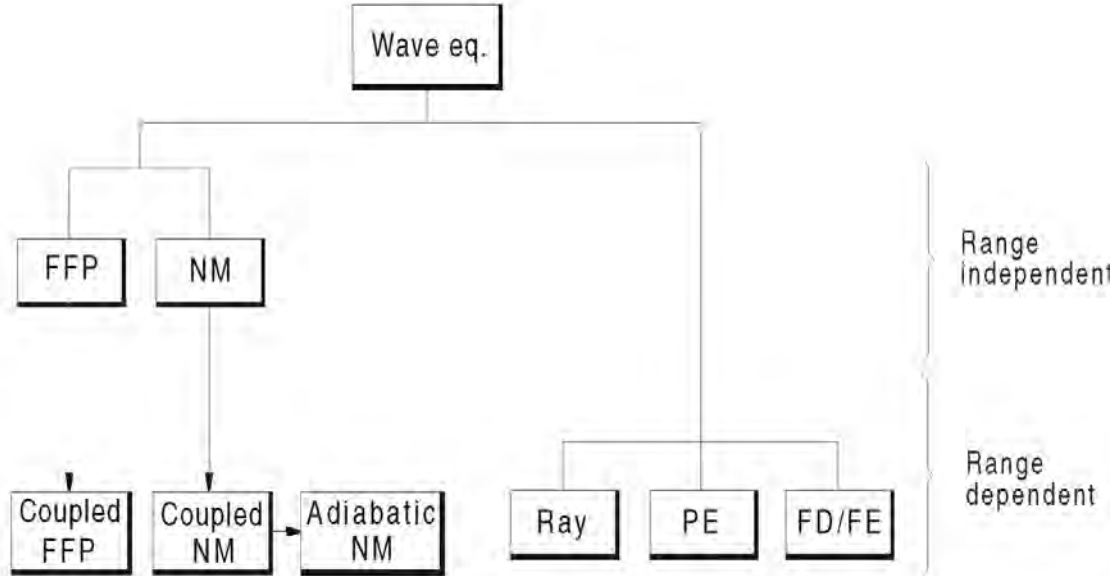
# SCHEMATIC OF SOUND PROPAGATION PATHS



## HIERARCHY OF UNDERWATER ACOUSTIC MODELS

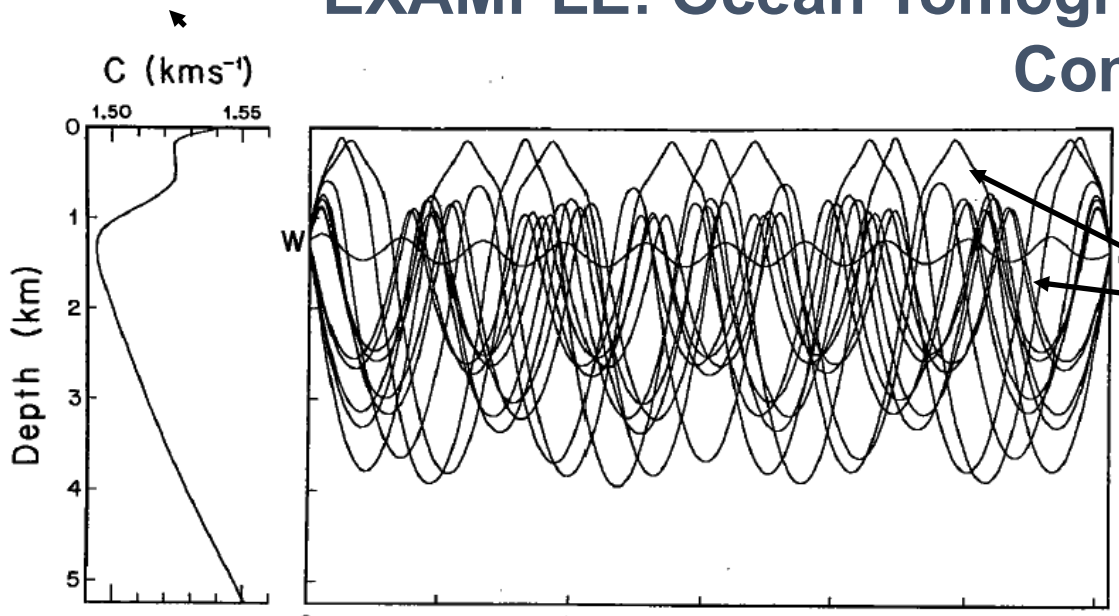
Background Theory is in:  
Jensen et al: **Computational Acoustics**

Online Models: <https://oalib-acoustics.org>

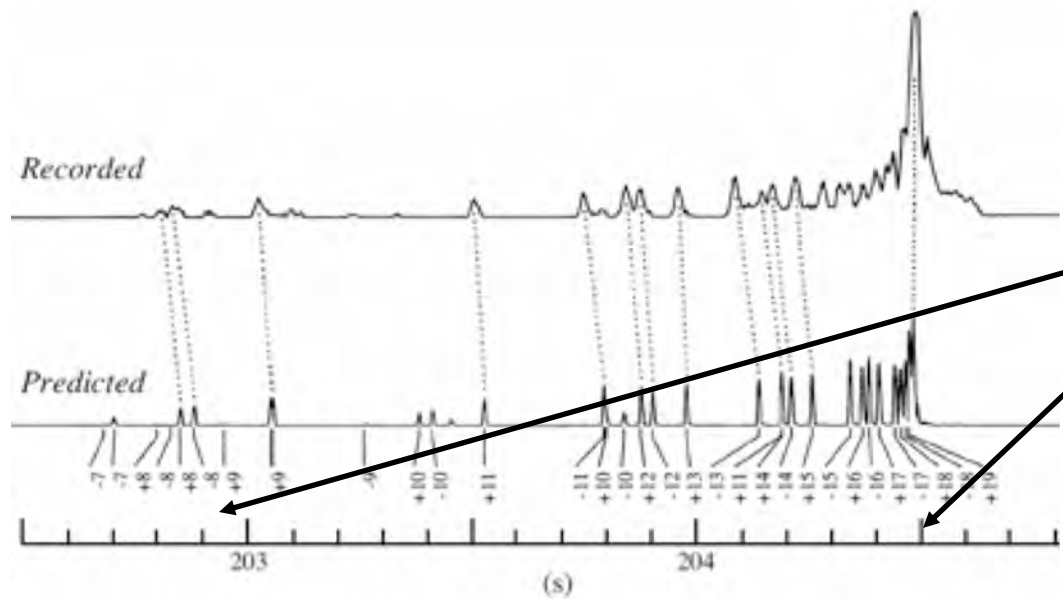




# EXAMPLE: Ocean Tomography: Signal Processing using Complexity



Different rays have  
Different group speeds



Therefore have different  
Arrival times

Which ray corresponds  
To which arrival time?

$$\nabla^2 G(r, r_s; z, z_s) + \frac{\omega^2}{[c + \Delta c(\mathbf{R})]^2} G(r, r_s; z, z_s) = -\delta(R - R_s), \quad (32)$$

which, to lowest order is

$$\nabla^2 G(r, r_s; z, z_s) + k^2(z) G(r, r_s; z, z_s) = -\delta(R - R_s) + \frac{2\omega^2 \Delta c(\mathbf{R})}{c^3} G(r', r_s; z', z_s). \quad (33)$$

The Born approximation then gives

$$\begin{aligned} G(r, r_s; z, z_s) - G_0(r, r_s; z, z_s) &\equiv \\ \Delta G &= -2\omega^2 \int_V G_0(r, r'; z, z') G_0(r', r_s; z', z_s) \frac{2\Delta c(\mathbf{R}')}{c(\mathbf{R}')^3} dV(\mathbf{R}'), \end{aligned} \quad (34)$$

which translates to the sensitivity of the Green's function to a sound speed perturbation,

$$\frac{\partial \Delta G(\mathbf{R}|\mathbf{R}')}{\partial \Delta c(\mathbf{R}')} = -2\omega^2 G(\mathbf{R}|\mathbf{R}') G(\mathbf{R}'|\mathbf{R}_s) \frac{1}{c(\mathbf{R}')^3}, \quad (35)$$

where we have made an obvious change in notation. We will also show below that this result is comparable to the adjoint of the PE model.

Since the pressure field from a broadband source at receiver  $r$  is

$$p_r(t) = \frac{1}{2\pi} \int_{-\infty}^{\infty} G(\mathbf{R}|\mathbf{R}'; \omega; c) P_s(\omega) e^{i\omega t} d\omega, \quad (36)$$

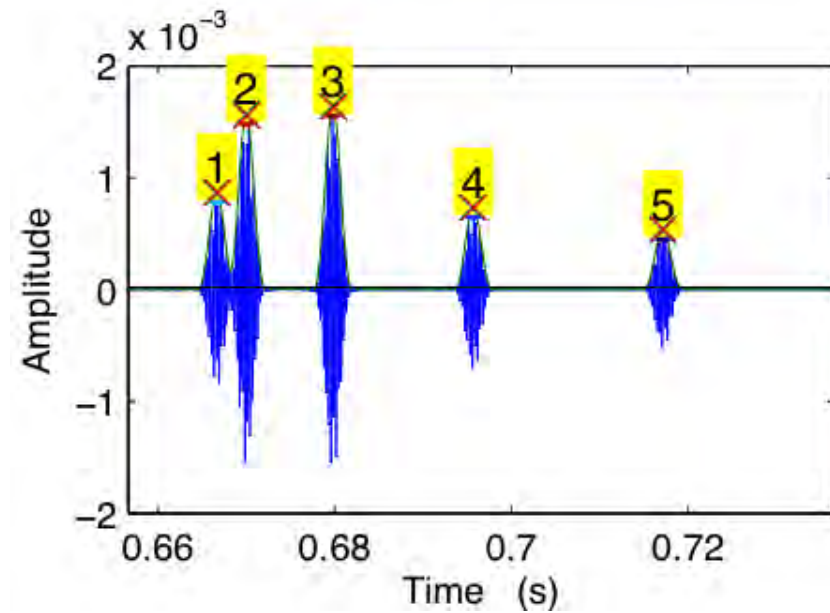
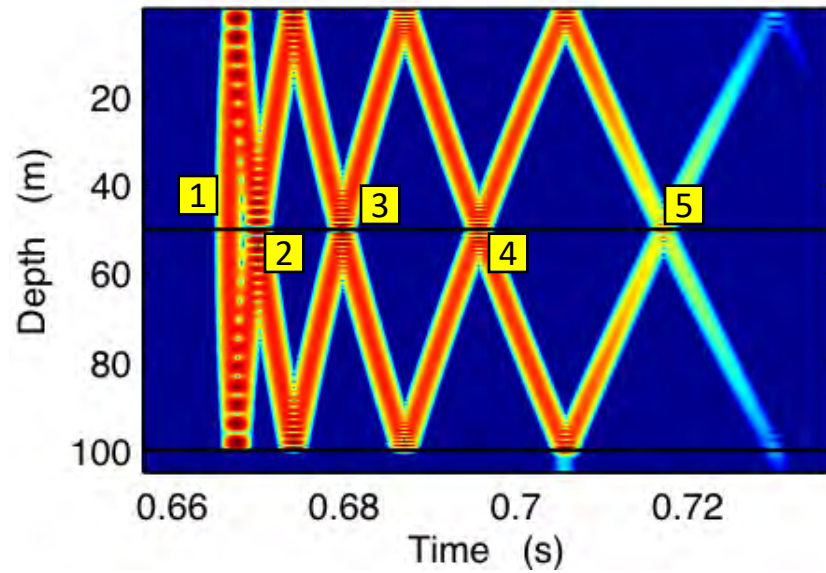
and the perturbed pressure is of the same Fourier form, we have

$$\frac{\partial p_r(t)}{\partial c(\mathbf{R}')} = \frac{1}{2\pi} \int_{-\infty}^{\infty} \left( -2\omega^2 G(\mathbf{R}|\mathbf{R}') G(\mathbf{R}'|\mathbf{R}_s) \frac{P_s(\omega)}{c(\mathbf{R}')^3} \right) e^{i\omega t} d\omega. \quad (37)$$

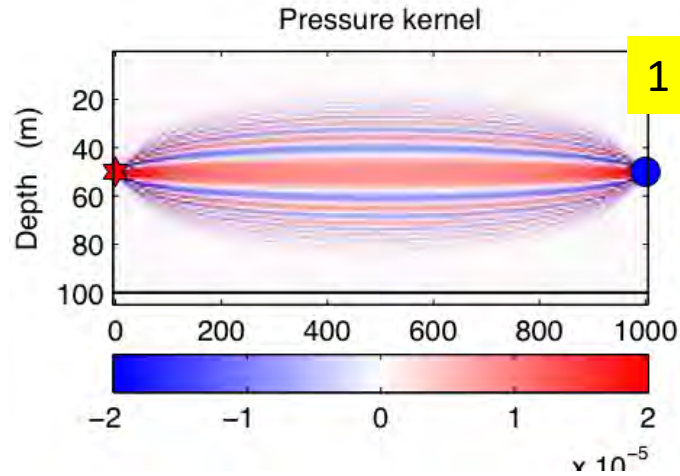
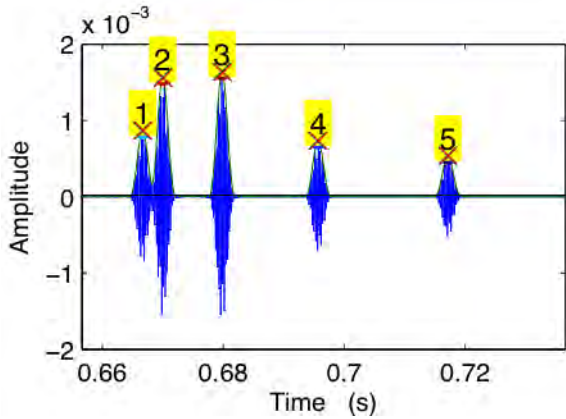
**HOW?-for example, use  
SENSITIVITY KERNEL/  
BORN APPROXIMATION**



# Simulations - pressure record

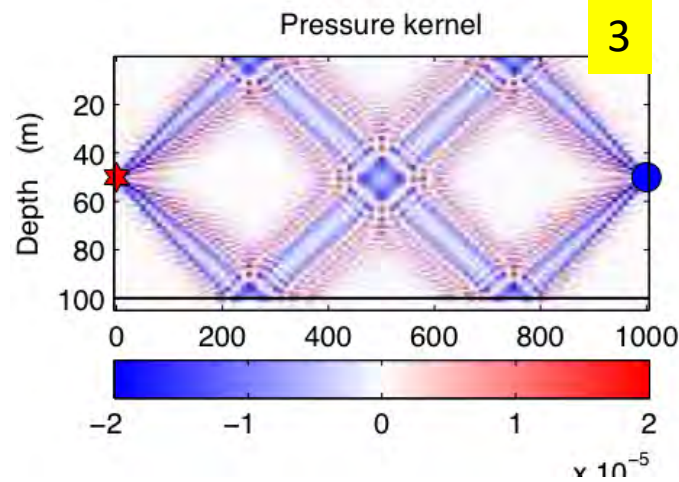
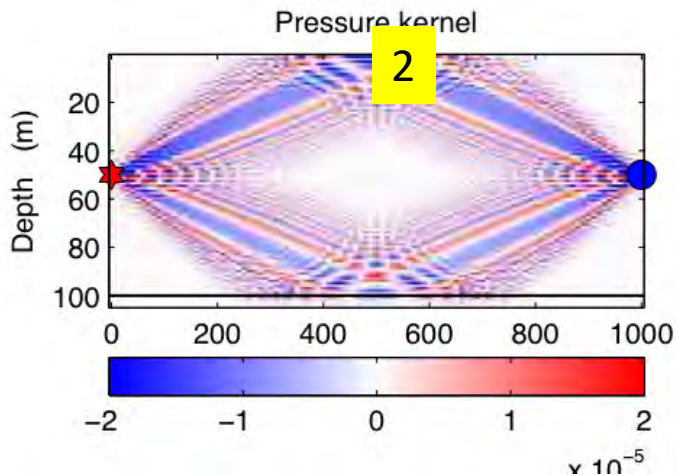


# Combine– Kernels for INVERSION



$$\Delta P = H \Delta C$$

$$\Rightarrow \Delta \hat{C} = \text{Inv}(H) \Delta P$$



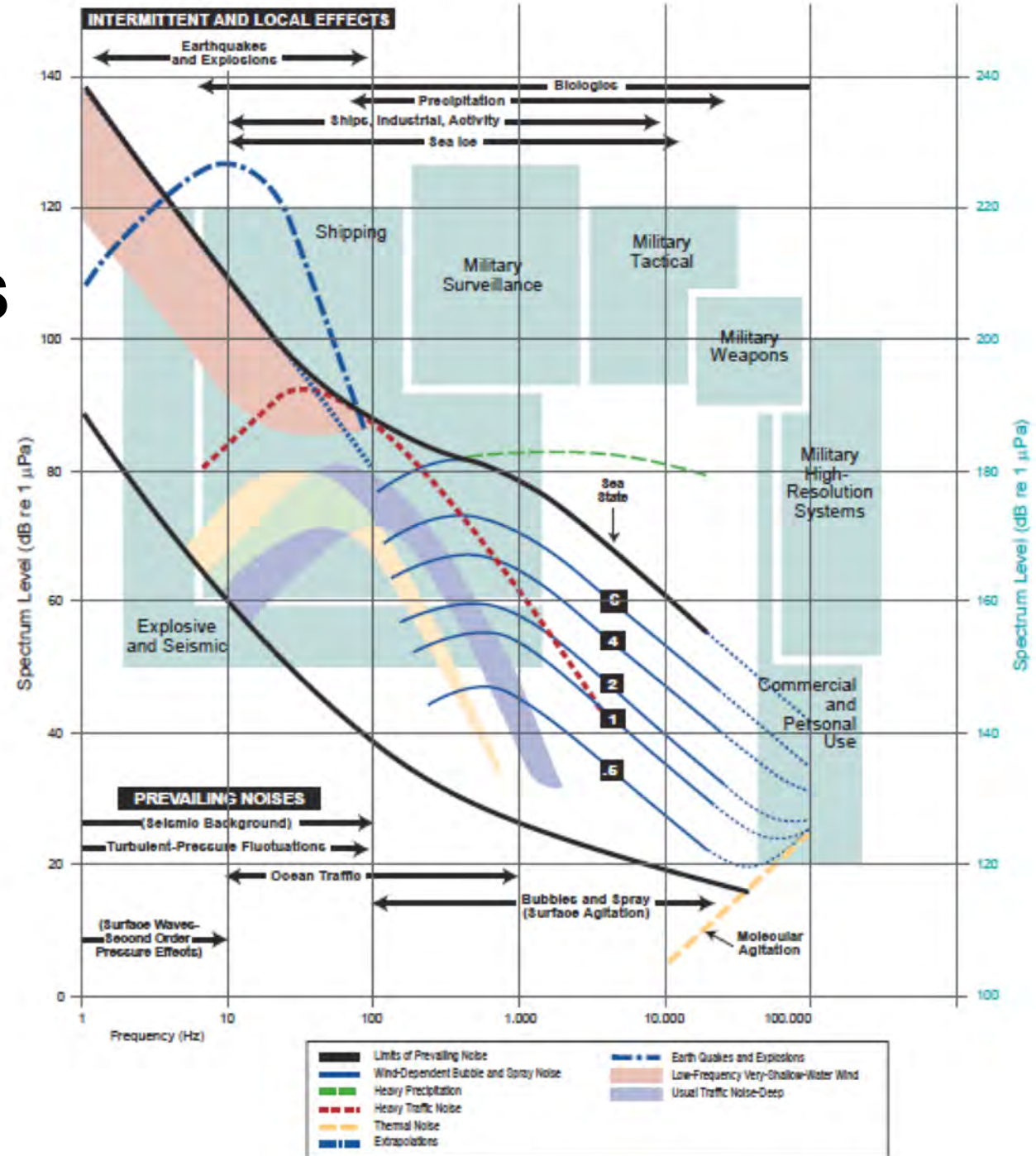
$$\begin{bmatrix} 1 \Delta p \\ 2 \Delta p \\ 3 \Delta p \\ 4 \Delta p \\ \vdots \\ N \Delta p \end{bmatrix}$$

=

$$\begin{bmatrix} {}^1 h_{r'_1} & {}^1 h_{r'_2} & {}^1 h_{R'} \\ {}^2 h_{r'_1} & {}^2 h_{r'_2} & {}^2 h_{R'} \\ {}^3 h_{r'_1} & {}^3 h_{r'_2} & {}^3 h_{R'} \\ {}^4 h_{r'_1} & {}^4 h_{r'_2} & {}^4 h_{R'} \\ \vdots & \vdots & \vdots \\ {}^N h_{r'_1} & {}^N h_{r'_2} & {}^N h_{R'} \end{bmatrix}$$

$$\begin{bmatrix} \Delta c_{r'_1} \\ \Delta c_{r'_2} \\ \vdots \\ \Delta c_{R'} \end{bmatrix}$$

# NOISE LEVELS AND SOURCE LEVELS



BRADLEY, STERN  
NRC 2008

| <b>Ships Underway</b>  | <b>Broadband Source Level<br/>(dB re 1 <math>\mu</math>Pa at 1 m)</b>                               |
|--|---|
| Tug and Barge (18 km/hour)   | 171   |
| Supply Ship (example: Kigoriak)  | 181   |
| Large Tanker   | 186   |
| Icebreaking  | 193   |
| <b>Seismic Survey</b>  | <b>Broadband Source Level<br/>(dB re 1 <math>\mu</math>Pa at 1 m)</b>                               |
| Air gun array (32 guns)  | 259 (peak)  |
| <b>Military Sonars</b>   | <b>Broadband Source Level<br/>(dB re 1 <math>\mu</math>Pa at 1 m)</b>                               |
| AN/SQS-53C<br>(U. S. Navy tactical mid-frequency sonar, center frequencies 2.6 and 3.3 kHz)                    | 235   |
| AN/SQS-56<br>(U. S. Navy tactical mid-frequency sonar, center frequencies 6.8 to 8.2 kHz)                      | 223   |
| SURTASS-LFA (100-500 Hz)   | 215 dB per projector, with up to 18 projectors in a vertical array operating simultaneously         |
| <b>Ocean Acoustic Studies</b>  | <b>Broadband Source Level<br/>(dB re 1 <math>\mu</math>Pa at 1 m)</b>                               |
| Heard Island Feasibility Test (HIFT)<br>(Center frequency 57 Hz)   | 206 dB for a single projector, with up to 5 projectors in a vertical array operating simultaneously |
| Acoustic Thermometry of Ocean Climate (ATOC)/North Pacific Acoustic Laboratory (NPAL) (Center frequency 75 Hz) | 195   |

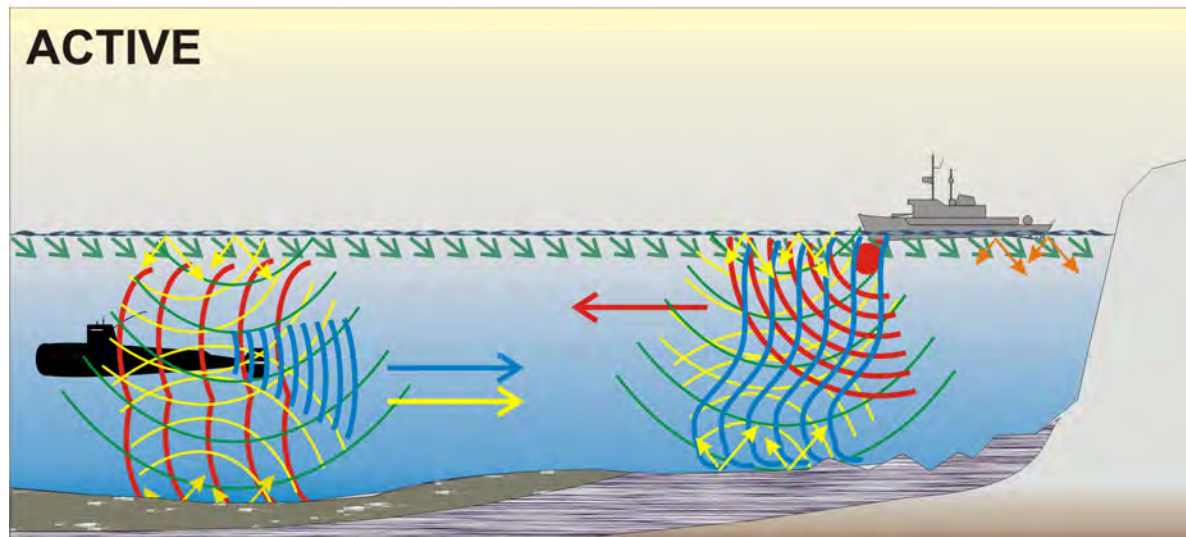
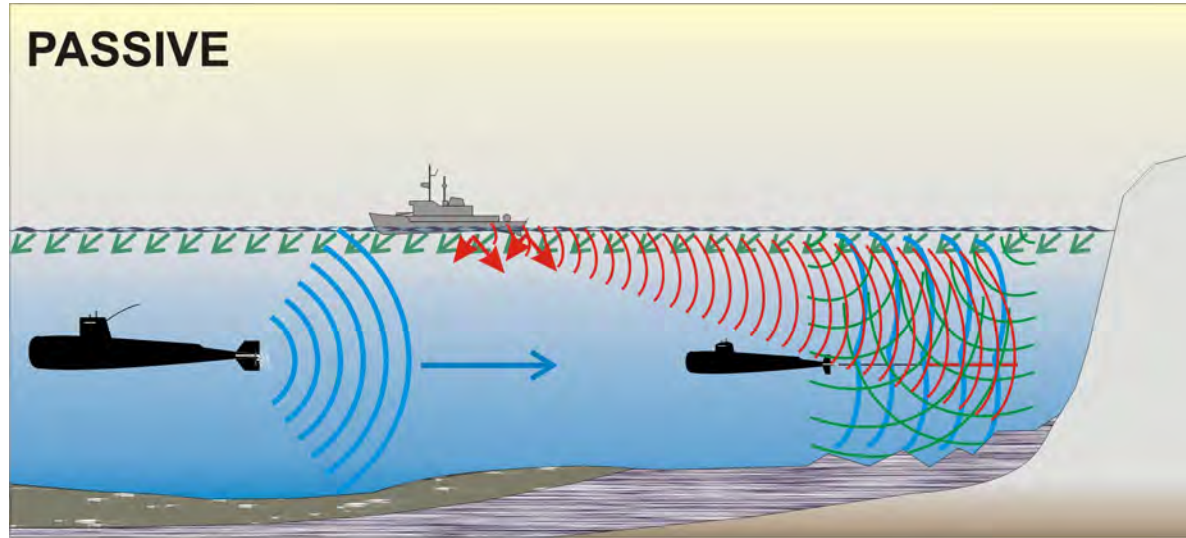
## Man Made Sounds

## Animal Sounds

| <b>Source</b>                            | <b>Broadband Source Level<br/>(dB re 1 <math>\mu</math>Pa at 1 m)</b> |
|--|---|
| Sperm Whale Clicks                       | 163-223   |
| Beluga Whale Echolocation Click          | 206-225 (peak-to-peak)  |
| White-beaked Dolphin Echolocation Clicks | 194-219 (peak-to-peak)  |
| Spinner Dolphin Pulse Bursts             | 108-115   |
| Bottlenose Dolphin Whistles              | 125-173   |
| Fin Whale Moans                          | 155-186   |
| Blue Whate Moans                         | 155-188   |
| Gray Whale Moans                         | 142-185   |
| Bowhead Whale Tonals, Moans and Song     | 128-189   |
| Humpback Whale Song                      | 144-174   |
| Humpback Whale Fluke and Flipper Slap    | 183-192   |
| Southern Right Whale Pulsive Call        | 172-187   |
| Snapping Shrimp                          | 183-189 (peak-to peak)  |



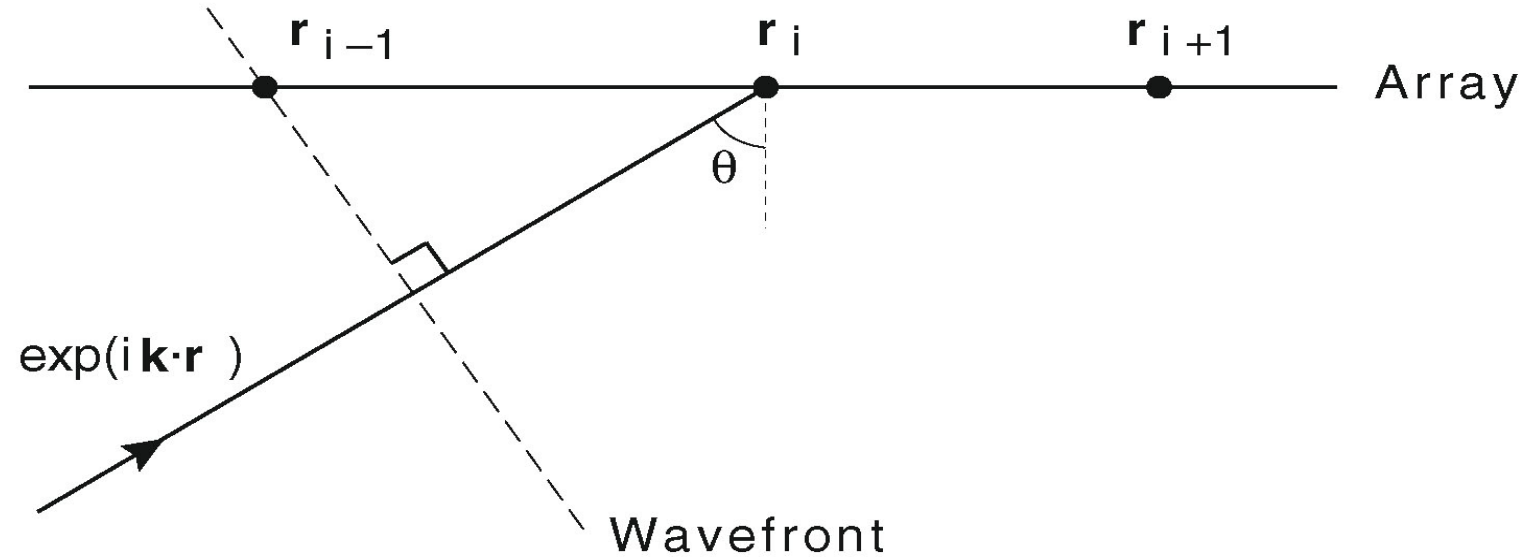
# TYPICAL SONAR VIEW OF NOISE: NUISANCE



# PLANE WAVE BEAMFORMING

gives us

Coherent Gain of Signal over Incoherent Noise and Directionality



$\mathbf{s}$ =Signal vector;  $\mathbf{d}=\mathbf{s} + \text{noise}$ ;  $\mathbf{K}$  (CSDM)  $\sim \langle \mathbf{d} \mathbf{d}^+ \rangle$  [DATA]

$\mathbf{w}$ ="replica" vector (usually from a model)

If  $\mathbf{w}=\mathbf{s}$  (or  $\mathbf{d}$ ), then  $\mathbf{w}^+ \mathbf{d} \longleftrightarrow \mathbf{w}^+ \mathbf{K} \mathbf{w}$  is maximum

→ At correct angle, each element  $w_i^*$  is cc of  $s_i$

# PLANE WAVE BEAMFORMING: ADAPTIVE PROCESSORS

Minimum Variance Distortionless Processor

$$F = \mathbf{w}_{MV}^\dagger \mathbf{K} \mathbf{w}_{MV} + \alpha (\mathbf{w}_{MV}^\dagger \mathbf{w} - 1). \quad (11)$$

(Two independent variables:  $\mathbf{w}_{MV}$  and  $\mathbf{w}_{MV}^*$ .)

$$\mathbf{w}_{MV} = \frac{\mathbf{K}^{-1} \mathbf{w}}{\mathbf{w}^\dagger \mathbf{K}^{-1} \mathbf{w}}. \quad (12)$$

$$B_{MV}(\theta_s) = [\mathbf{w}^\dagger(\theta_s) \mathbf{K}^{-1}(\theta_{true}) \mathbf{w}(\theta_s)]^{-1}. \quad (13)$$

Eigenvector Beamformers

$$\mathbf{K} = \sum_{i=1}^M \lambda_i \mathbf{v}_i \mathbf{v}_i^\dagger, \quad (14)$$

$$\mathbf{K} \mathbf{v}_i = \lambda_i \mathbf{v}_i, \quad i = 1, \dots, M. \quad (15)$$

$$\mathbf{K} = \sum_{i=1}^p \sigma_i \mathbf{s}_i \mathbf{s}_i^\dagger + \mathbf{K}_n. \quad (16)$$

$$\mathbf{K} = \sum_{i=1}^p \sigma_i \mathbf{s}_i \mathbf{s}_i^\dagger + \sigma_n \mathbf{I} = \sum_{i=1}^p (\sigma_i + \sigma_n) \mathbf{v}_i \mathbf{v}_i^\dagger. \quad (17)$$

$$\mathbf{K}' = \sum_{i=1}^p \lambda_i \mathbf{v}_i \mathbf{v}_i^\dagger. \quad (18)$$

$$\mathbf{K}_{\perp sig}^{-1} = \sum_{i=M-p}^M \lambda_i^{-1} \mathbf{v}_i \mathbf{v}_i^\dagger. \quad (19)$$

# Conventional and MVDR (“ADAPTIVE”) Beamforming

For each hypothetical source position  $(r_i, z_i)$ , a replica vector  $d$  is implemented as:

$$d = p_{z_s = z_i}(\text{distance source array, depth of elements})$$

$d$  is then normalized to unity.

- Conventional BF:

$$W_c = d$$

- MVDR BF:

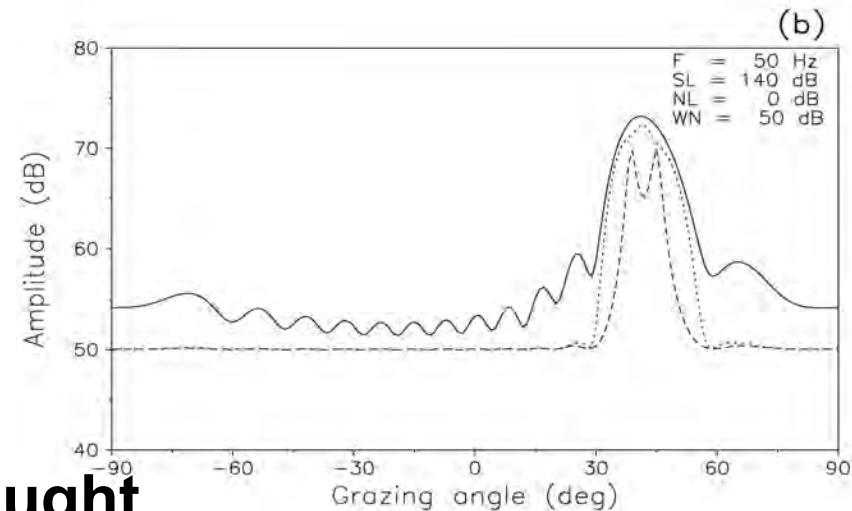
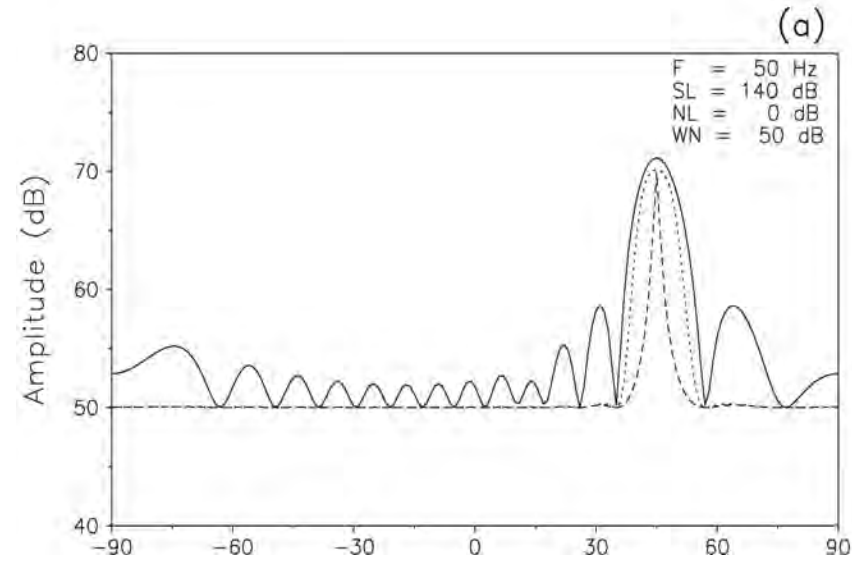
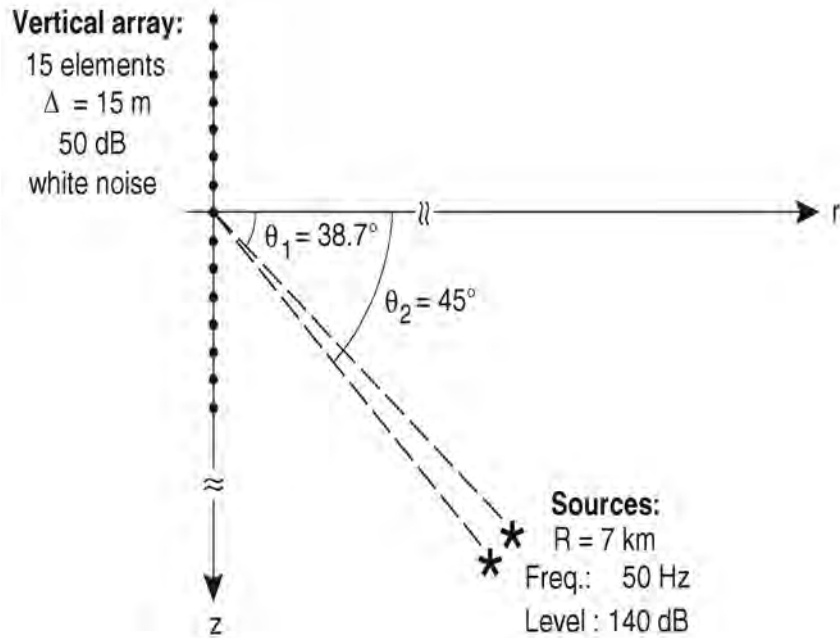
$$W_{MV} = \frac{K^{-1}d}{d^H K^{-1}d}$$

Power output:

$$B = W^H K W$$

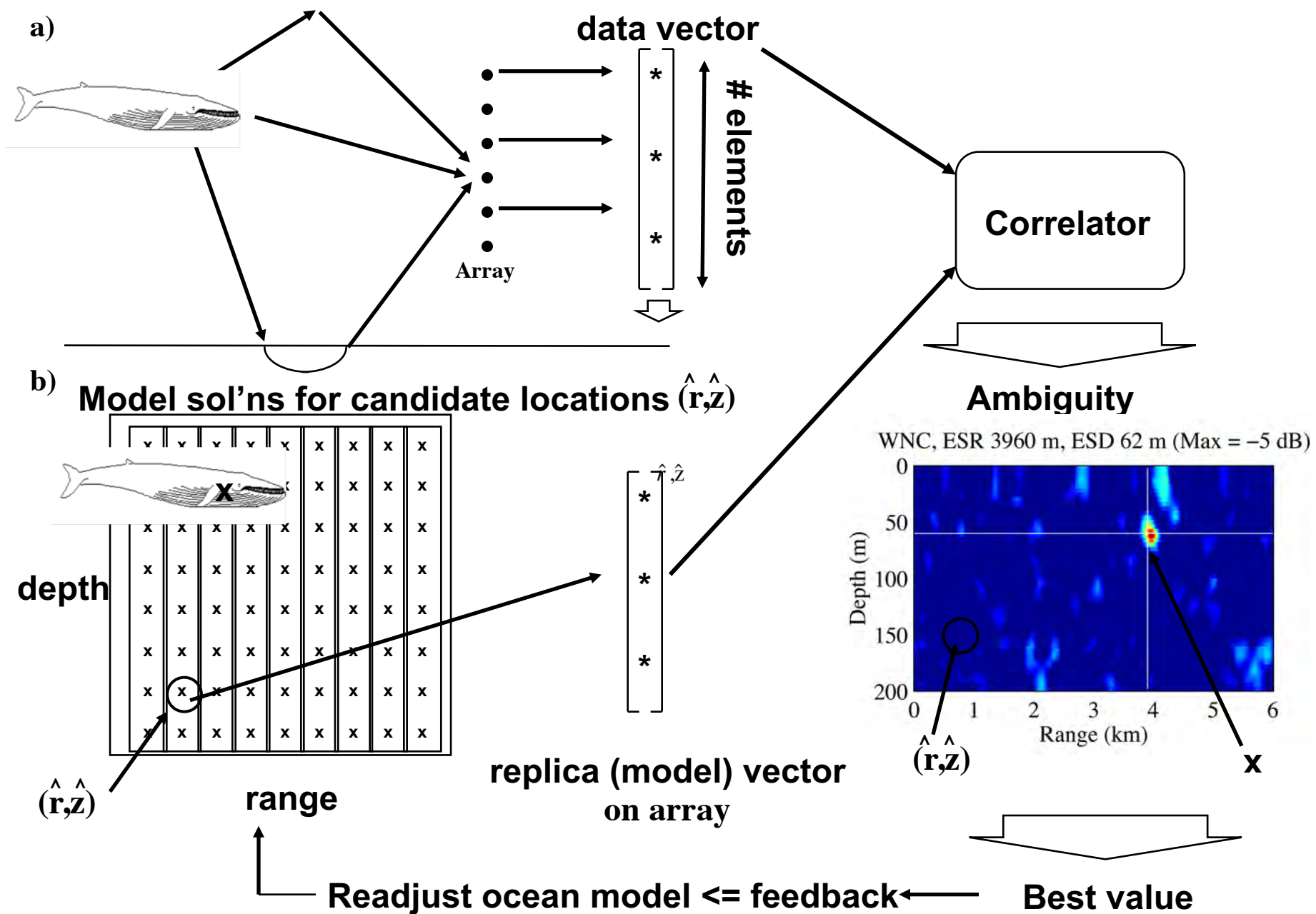


# LINEAR AND ADAPTIVE BEAMFORMING

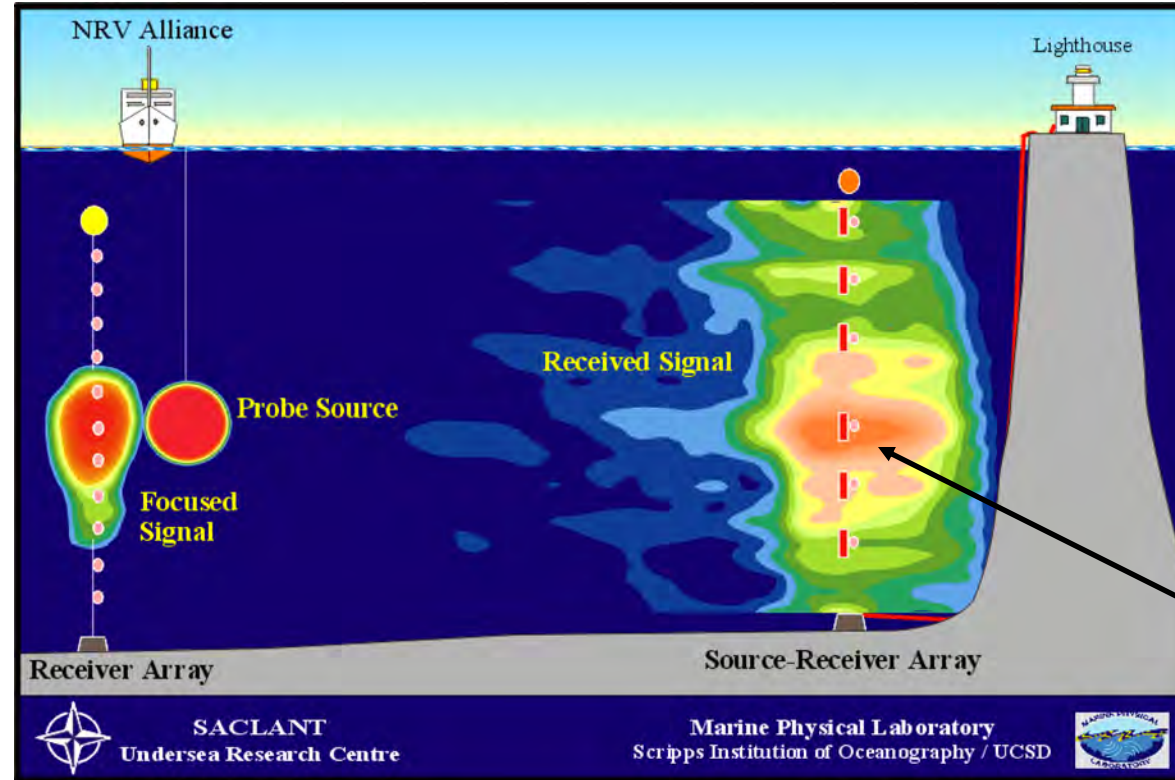


**One of sources could be thought of a *coherent* interferor (eigenvector decomposition)**

# Matched Field (Model Based) Processing (MFP)



# COMPARE TO: Time Reversal Process in the Ocean



data

Frequency Domain

$$P_{pc}(r, z; \omega) = \sum_{j=1}^J G_{\omega}(r, z, z_j) G_{\omega}^*(R, z_j, z_{ps})$$

Time Domain

$$P_{pc}(r, z; t) = \frac{1}{(2\pi)^2} \int \sum_{j=1}^J \left[ \int G_{t'+t''}(R, z_j, z_{ps}) G_{t'}(r, z, z_j) dt' \right] S(t'' - t + \mathcal{D}) dt''$$

# Time Reversal vs Matched Field Processing

$$\mathbf{B}_{\text{TRP}} = |\mathbf{P} + \mathbf{W}|^2$$

**W : Time Reverse Data and retransmit using ACTIVE SOURCES**

$$\mathbf{B}_{\text{MFP}} = \mathbf{W}^+ (\mathbf{P}\mathbf{P}^+) \mathbf{W}$$

**W : computer generated replica fields**

$$B = W^H K W$$

**SO: TR EXISTENCE  
THEOREM THAT  
MFP SHOULD WORK**

WHEN DOES ALL THIS (TR=MFP) TYPICALLY WORK?

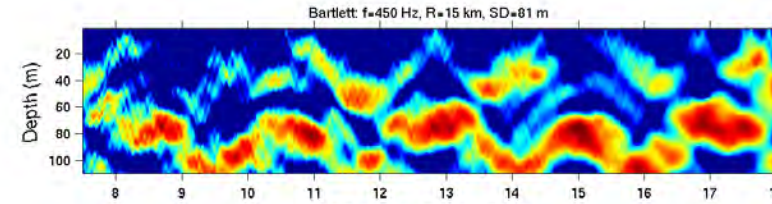
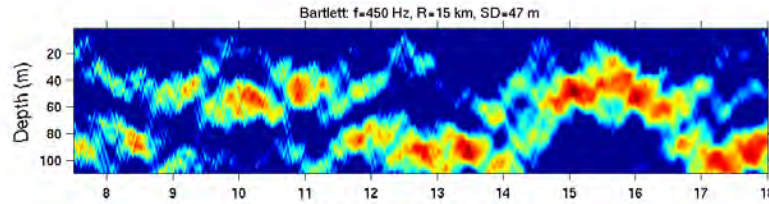
- STABLE ENVIRONMENT
- LOWER FREQUENCIES
- GOOD SNR

# STABLE, LOWER FREQ. MFP: (450 Hz)

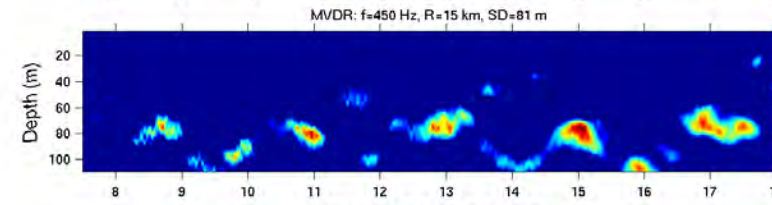
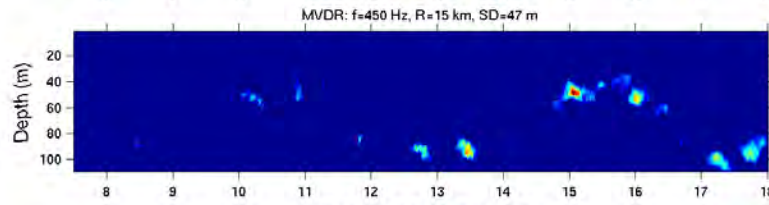
SD: 47 m, R = 15 km

SD: 81 m, R=15km 15km km

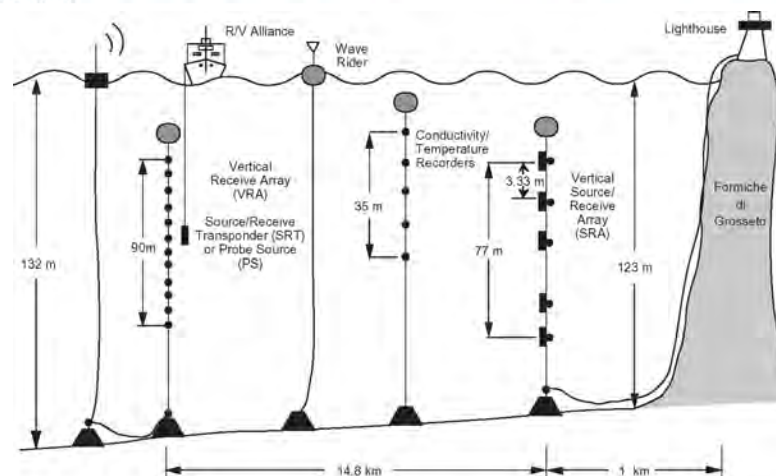
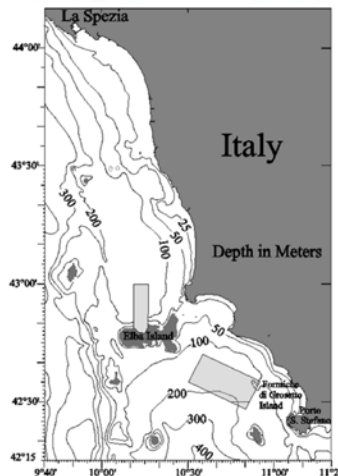
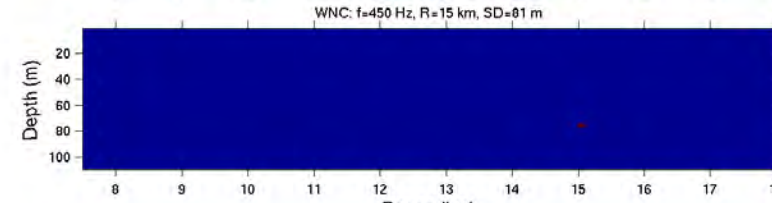
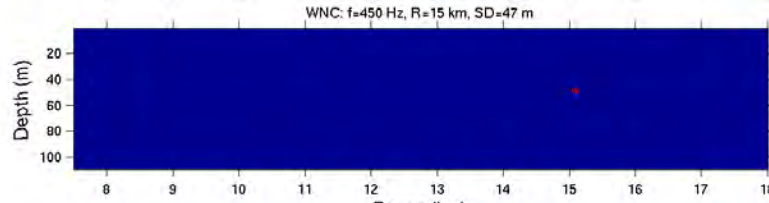
BT



MVDR

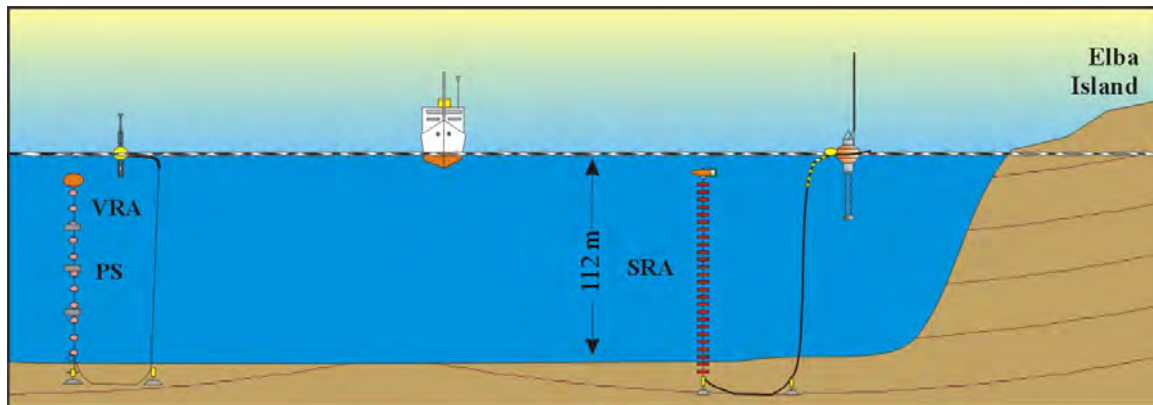
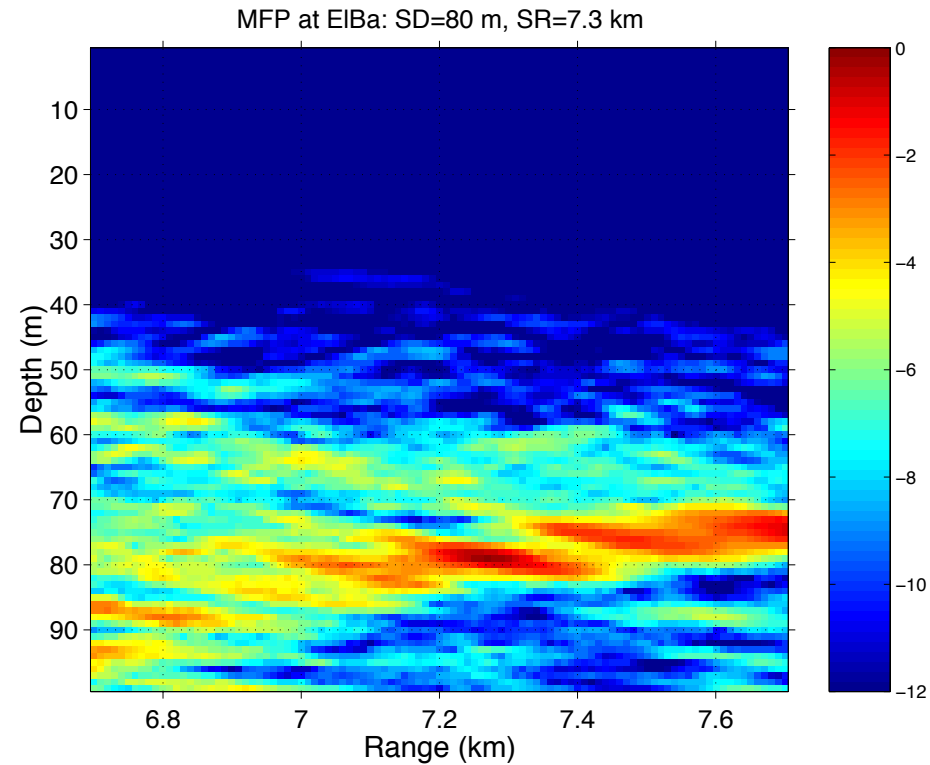
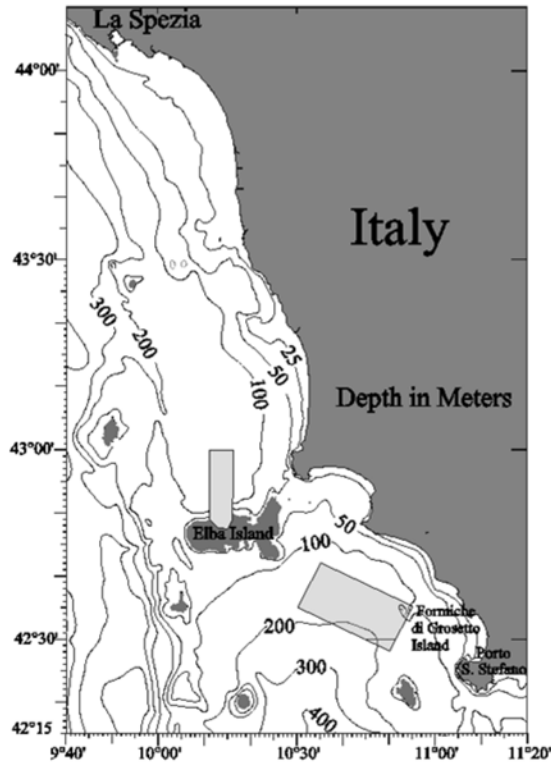


WNC



SRA: 23 elements  
3.33-m spacing  
(77-m aperture)

# BUT AT HIGHER FREQUENCY(3.5 kHz)

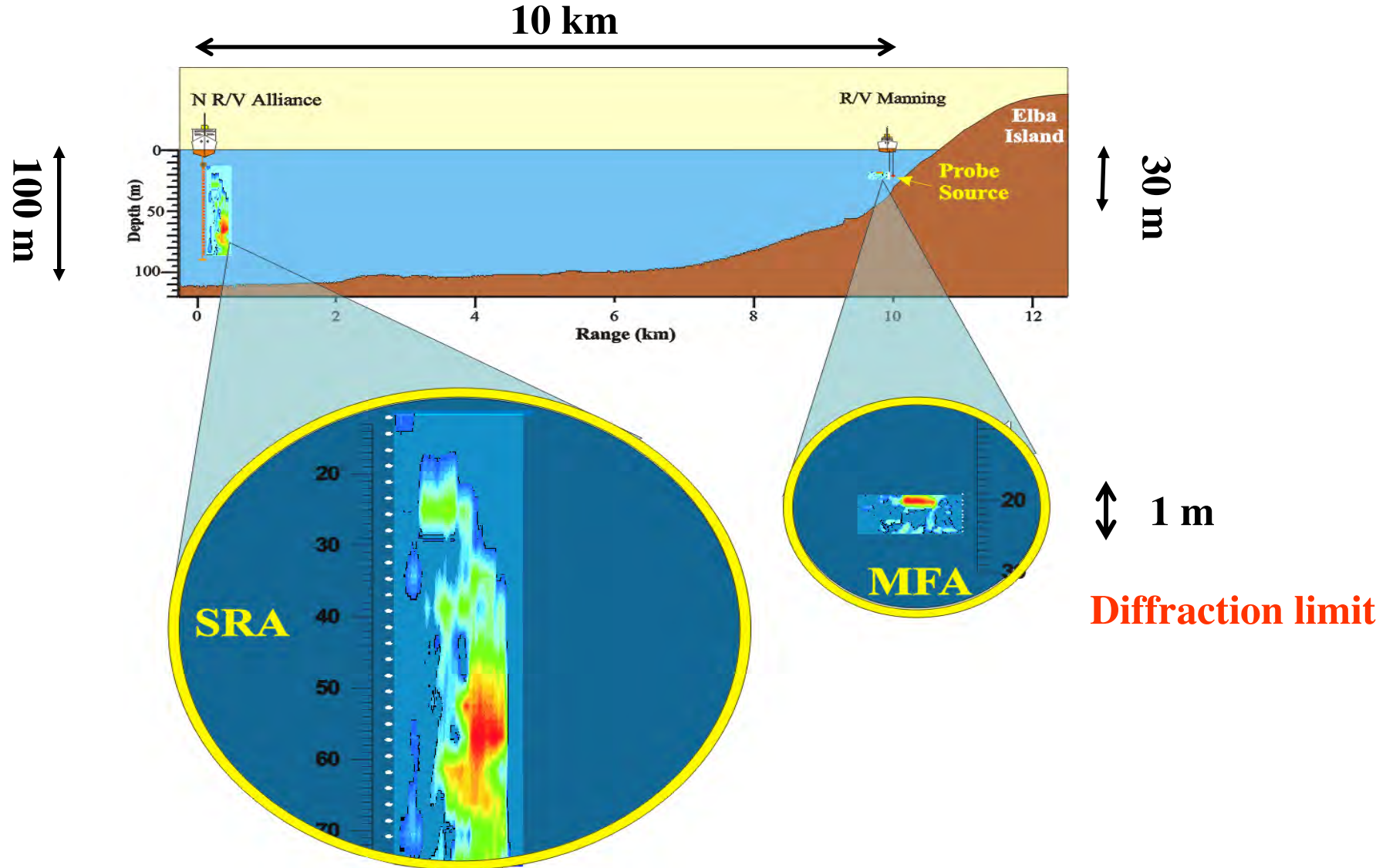


SRA: 29 elements  
3.33-m  
spacing  
(78-m  
aperture)



# Time Reversal Mirror Experiment: Elba

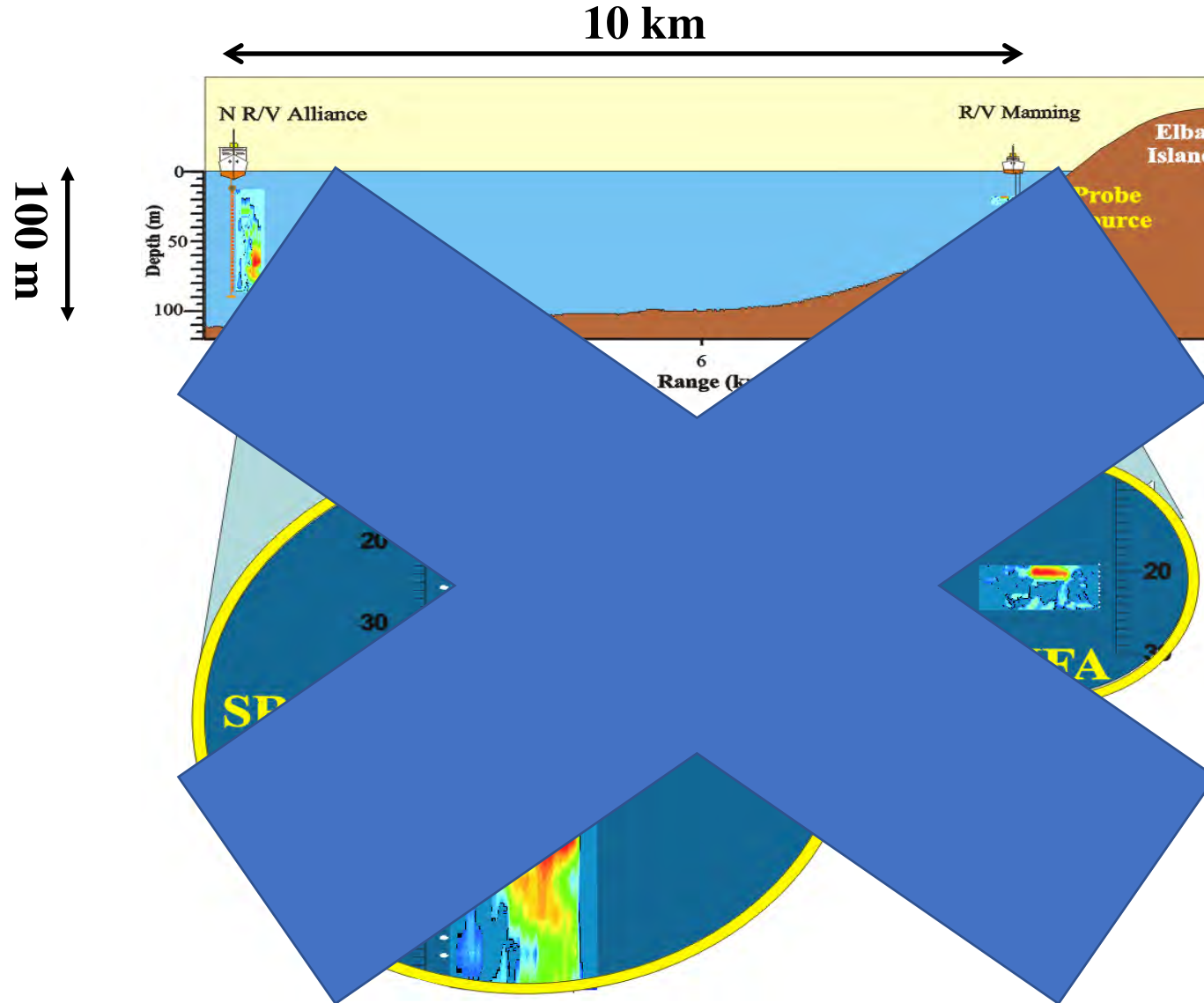
## SUPER EXISTENCE THM for MFP





# Time Reversal Mirror Experiment: Elba

*SUPER EXISTENCE THM for MFP*



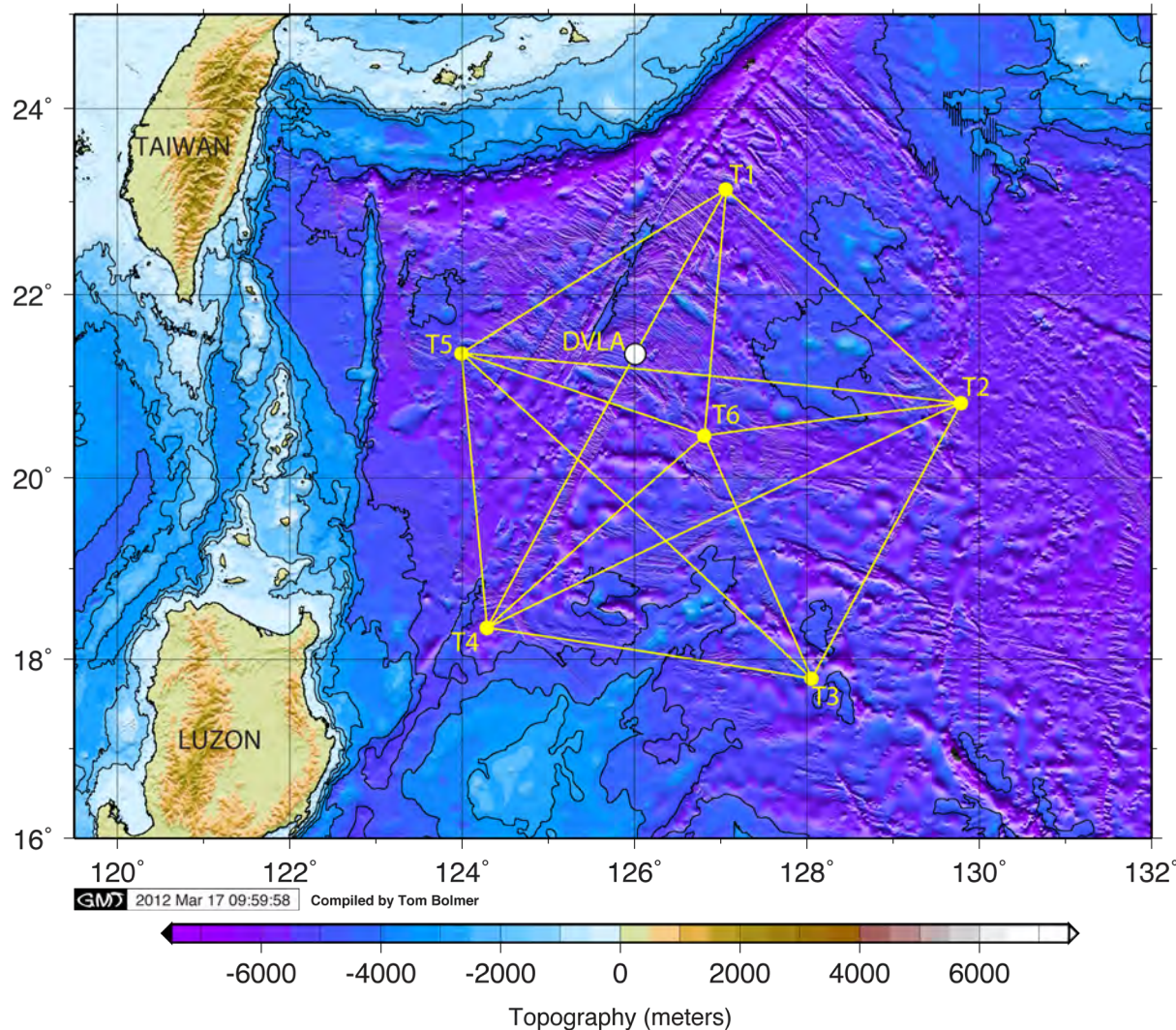
**MFP HAS  
NOT  
WORKED**

Because  
Environment **NOT**  
Known Well Enough

# CAN TOMOGRAPHY HELP?

→ SIGNAL PROCESSING?

# 2010–2011 NPAL Philippine Sea Experiment (MOST ACCURATE TOMOGRAPHY EXP TO DATE)



- T1–T6: WRC transceivers
- 660 km diameter
- DVLA
- Moored oceanographic sensors
- CTD
- Acoustic Seagliders

# SUMMARY OF SELECTED RESULTS

- Model with Climatology 150 ms
- Assimilate Oceanography 80 ms
- Assimilate Acoustics <20ms
  
- 20 ms → 30 meters
- 300 Hz → Wavelength 5 m

No enhancement for Array Processing (need  $\sim \lambda/8$ )

{Accuracy off by a factor of  $\sim 30$ )

Mismatch shows up as NOISE

# Some *Thoughts* on UW (Passive) Signal Processing

- Classical plane wave array processing well understood and limited by rigorous statistically derived bounds (on variances) and SNR
- Matched field Processing works only for lower frequencies where environment can be described with sufficient accuracy.
- Some focalization methods have been shown to be promising but still very SNR limited
- No new methods have reliably gone beyond above limitations.
- Random Fluctuation Theory so far applied to just quantifying limitations
- Machine Learning has not *yet* provided additional capabilities or insight

**HAVE NOT YET TAKEN (PASSIVE) ADVANTAGE OF COMPLEXITY!!!**

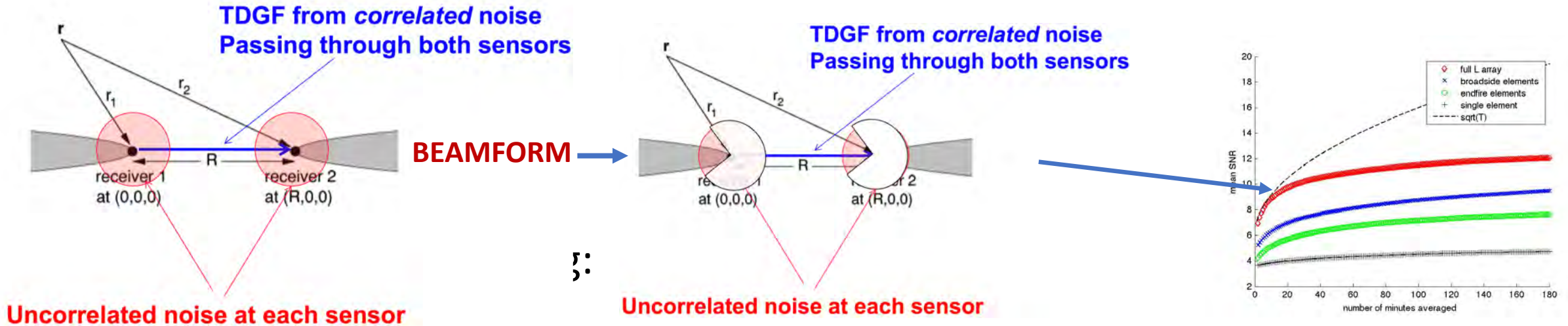
.....MOVING ON to NOISE CORRELATION METHODS in UW ...



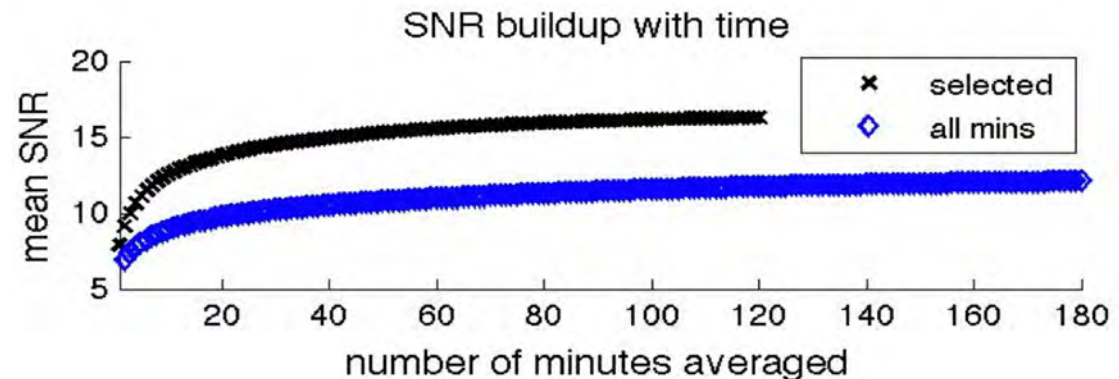
# NOISE CORRELATIONS IN OCEAN ACOUSTICS

Is now very mature: FREE SPACE; WAVEGUIDE; BEAMFORMING—

ISSUE: CORRELATION TIME vs Medium Fluctuation Time: **SPEEDUP Process:**



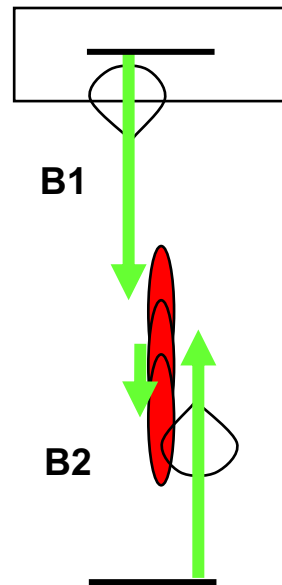
Pick endfire levels only above  
A threshold **and throw data  
Away!!!**



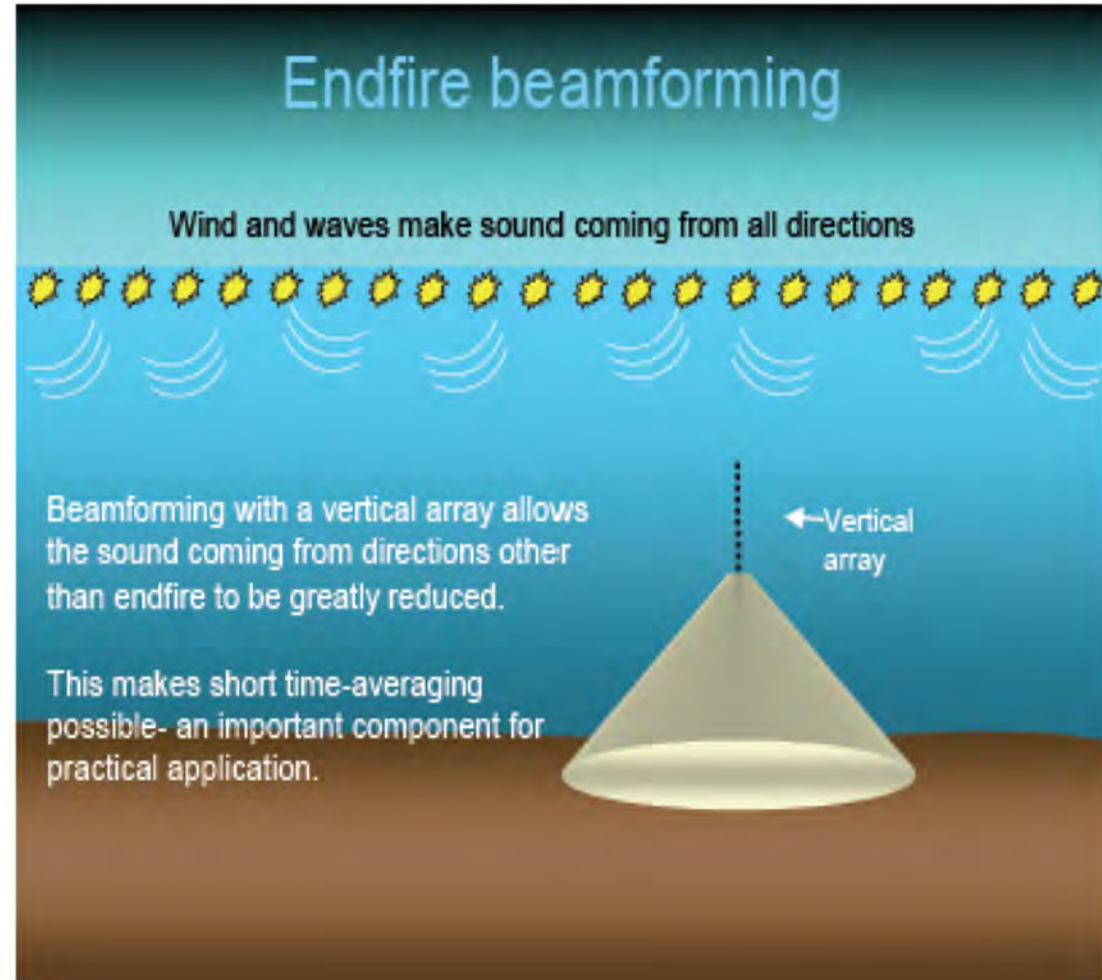
# Passive fathometer:

(Horizontal Array used as Vertical Array)

**Using ambient noise on a drifting array we can map the bottom properties**



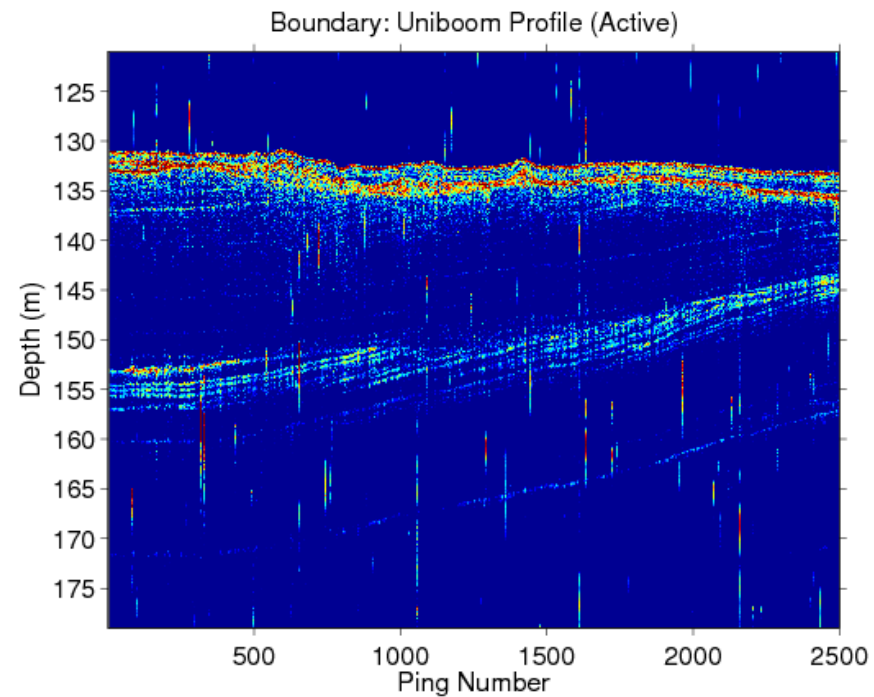
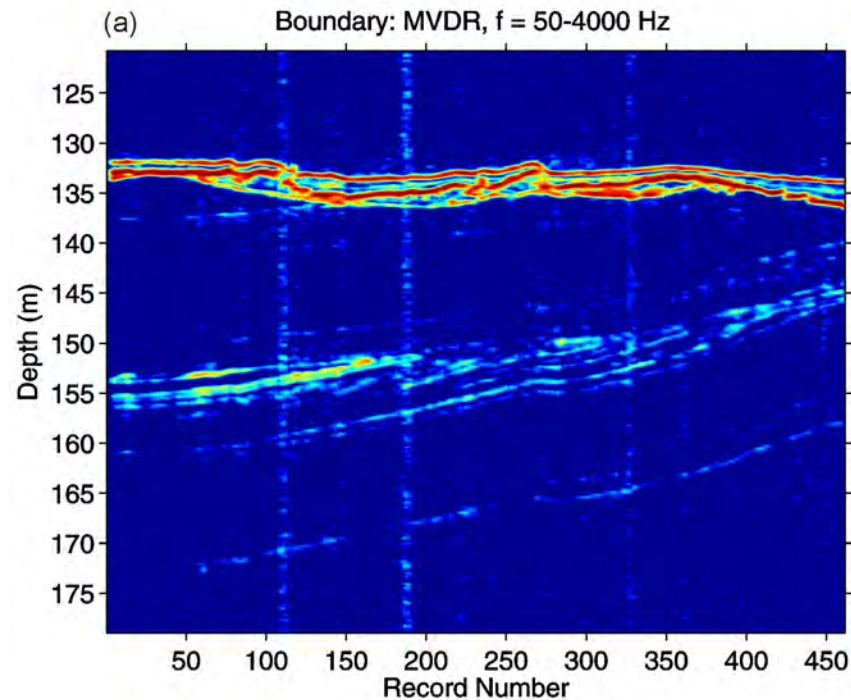
Siderius et al., JASA 2006,  
Gerstoft et al., JASA 2008,  
Harrison, JASA 2009,  
Traer et al., JASA 2009,  
Siderius et al., JASA 2010



# Passive fathometer (drifting array)

**Ambient noise 50-4000 Hz**

**Boomer**

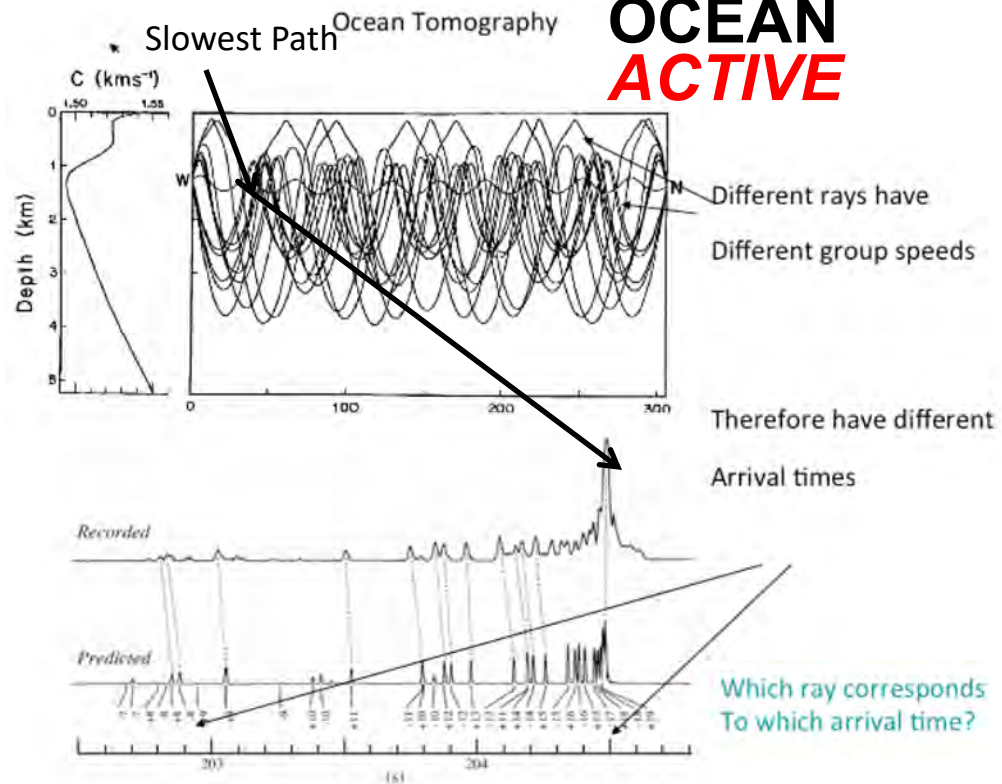


**Adaptive processing gives better resolution of reflections**



# BACKGROUND IIA: IMAGING

## OCEAN ACTIVE



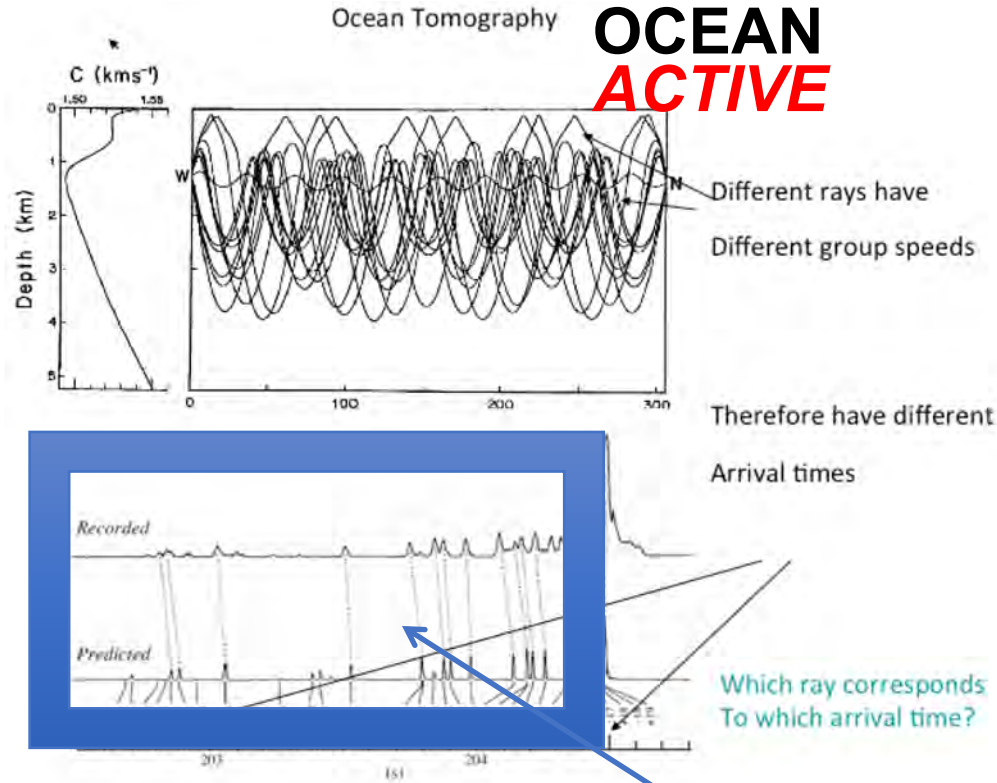
REQUIRES ACTIVE SOURCE THAT IS:

- 1) PERFECTLY **KNOWN** WRT TIME SIGNAL AND SYNCHRONIZATION
- 2) PERFECTLY **KNOWN** WRT SOURCE/RECEIVER GEOMETRY

# BIG OCEAN TOMOGRAPHY and NOISE

# BACKGROUND IA: IMAGING

## OCEAN ACTIVE



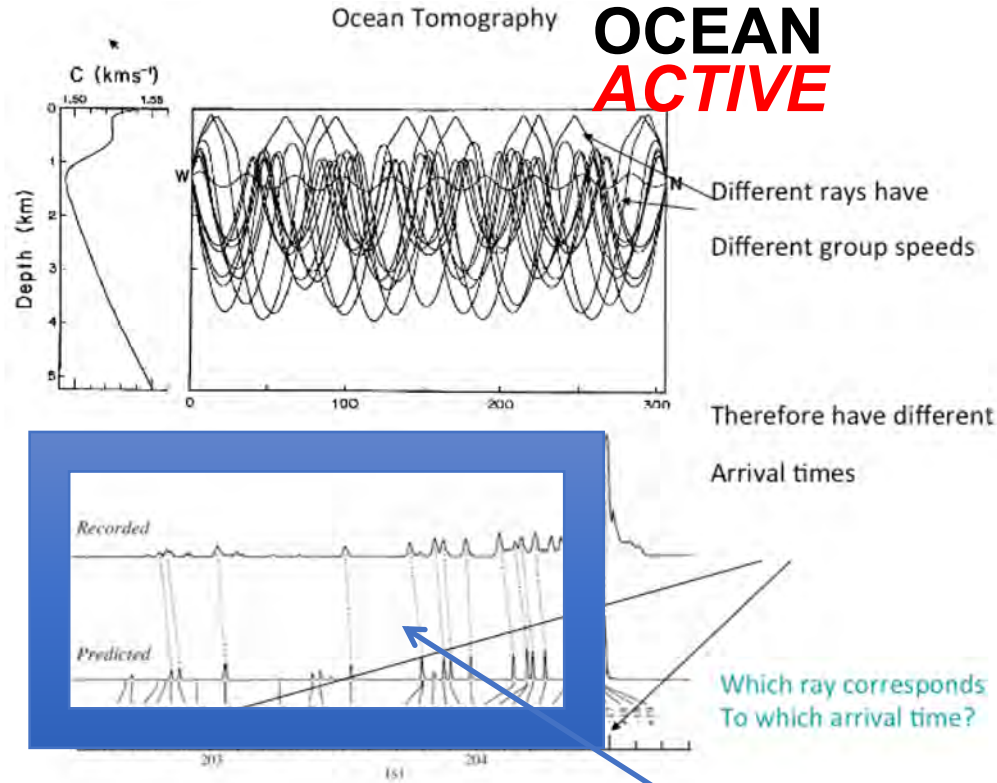
WITHOUT ACTIVE SOURCE THAT IS:

- 1) PERFECTLY KNOWN WRT TIME SIGNAL AND SYNCHRONIZATION
- 2) PERFECTLY KNOWN WRT SOURCE/RECEIVER GEOMETRY

**GOAL:**

**IMAGE WITH ONLY RANDOM AMBIENT SOURCES  
OF OPPORTUNITY**

# BACKGROUND IIB: IMAGING



**OCEAN  
ACTIVE**

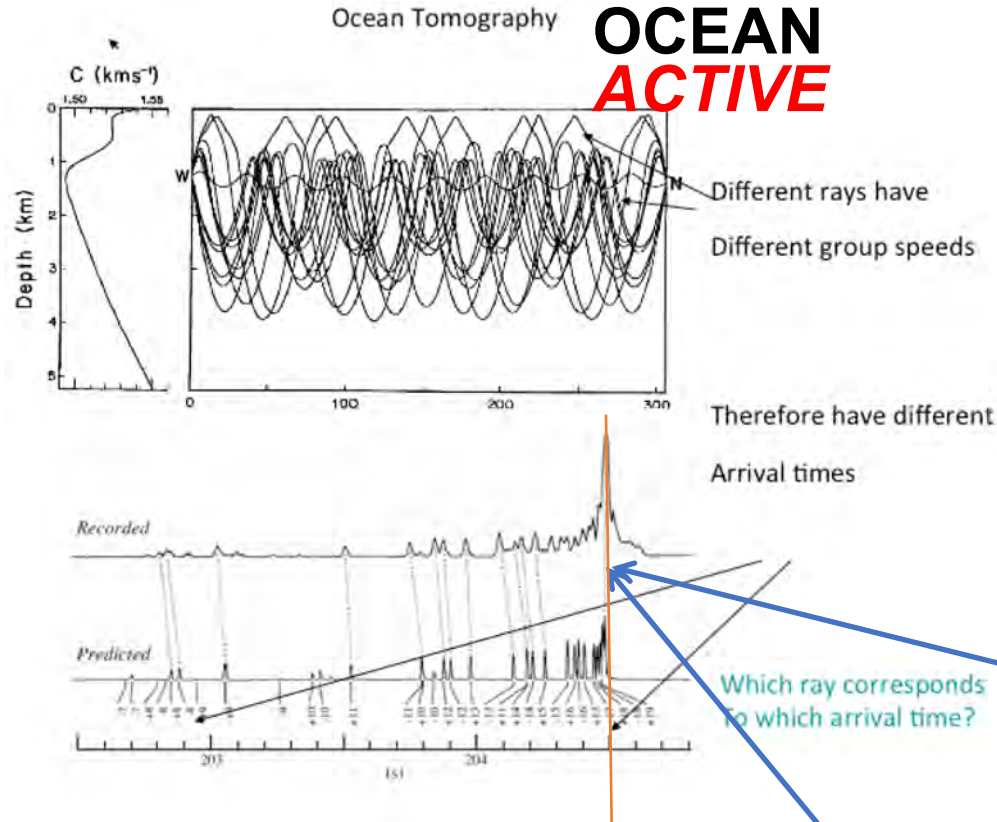
**WITHOUT** ACTIVE SOURCE THAT IS:

- 1) PERFECTLY **KNOWN** WRT TIME SIGNAL AND SYNCHRONIZATION
- 2) PERFECTLY **KNOWN** WRT SOURCE/RECEIVER GEOMETRY

**VERY HARD**  
**GOAL:**  
**IMAGE WITH ONLY RANDOM AMBIENT SOURCES**  
**WITHOUT SOURCE INFO**  
**OF OPPORTUNITY**

# BACKGROUND IIC: IMAGING

## OCEAN ACTIVE



WITHOUT ACTIVE SOURCE THAT IS:

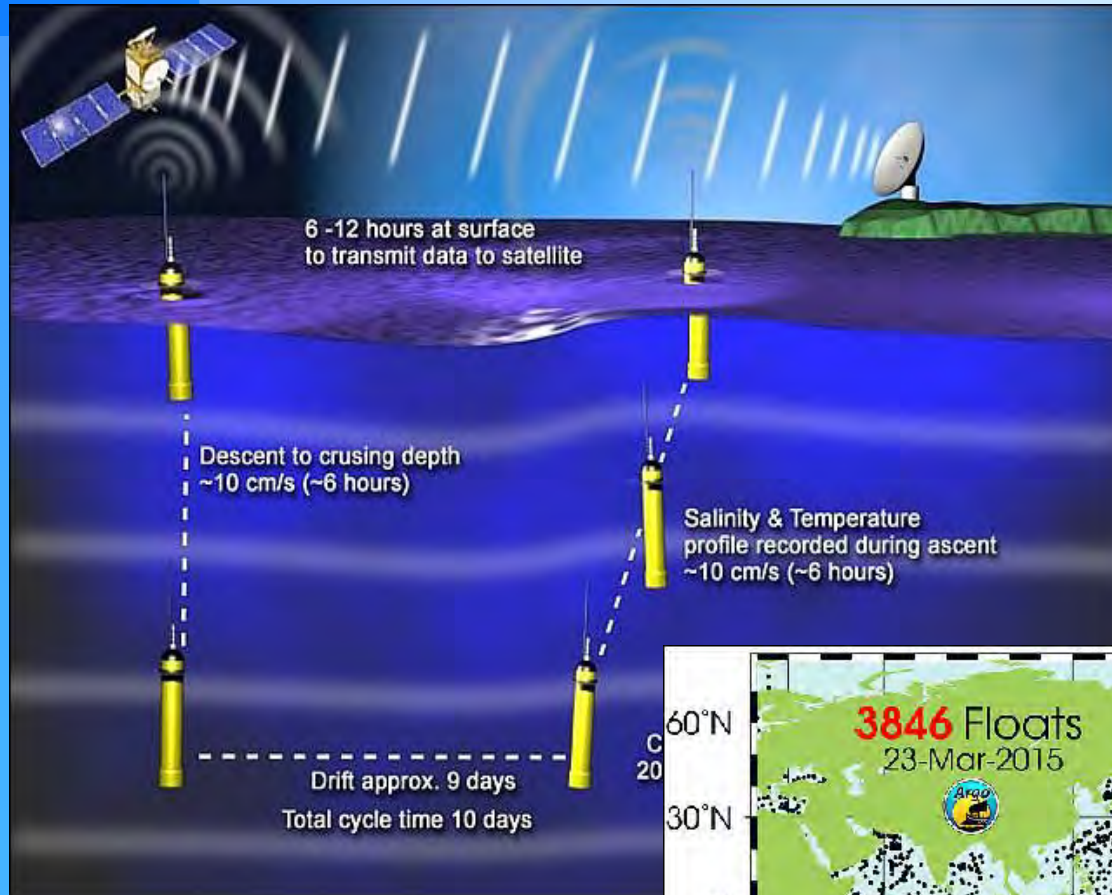
- 1) PERFECTLY KNOWN WRT TIME SIGNAL AND SYNCHRONIZATION
- 2) PERFECTLY KNOWN WRT SOURCE/RECEIVER GEOMETRY

LAST ARRIVAL

**LESS HARD GOAL:**  
**IMAGE WITH ONLY RANDOM AMBIENT SOURCES**  
**WITHOUT SOURCE INFO**  
**OF OPPORTUNITY**



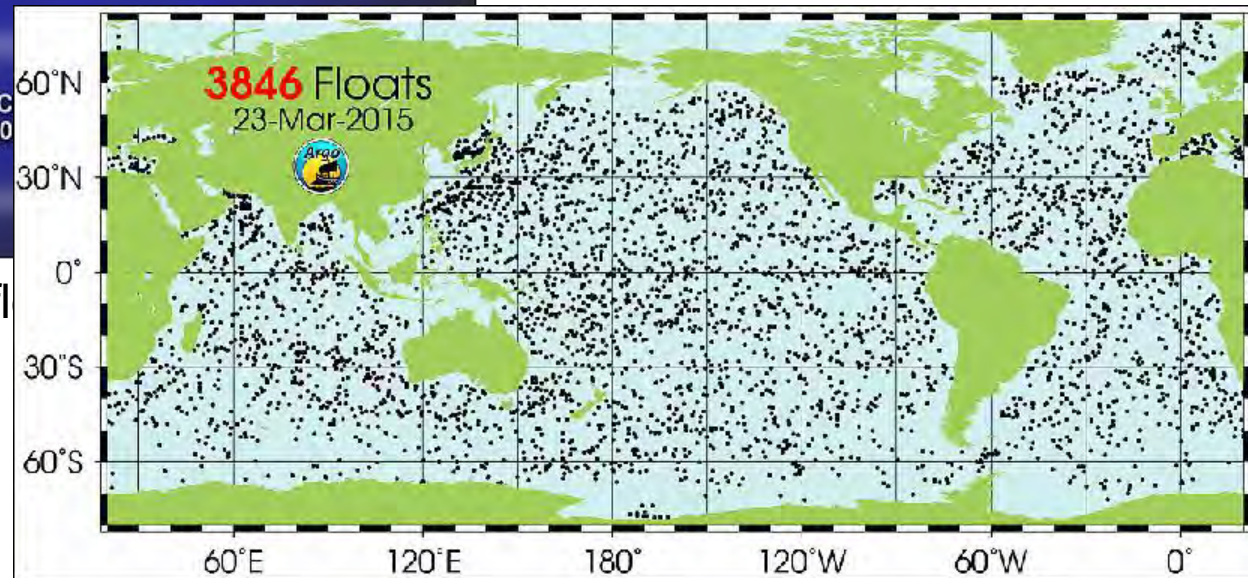
# Measuring deep ocean temperatures



Schematic view of the SOLO float (image credit: UCSD)

- Satellite observations are most suited for sensing ocean temperature “close” to surface
- Deep oceans most commonly sense with profiling floats.

[image credit: AIC (Argo Information Center), UCSD]



NOISE



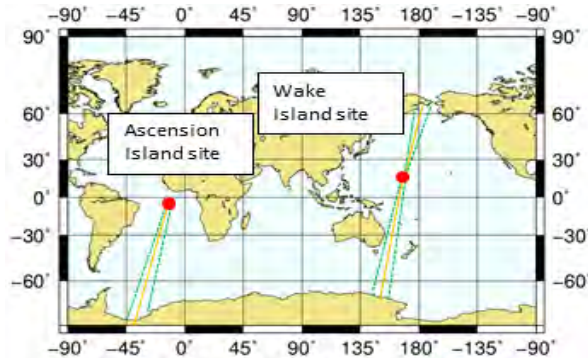
# Passive thermometry of the deep ocean

Comparison with ARGO temperature data

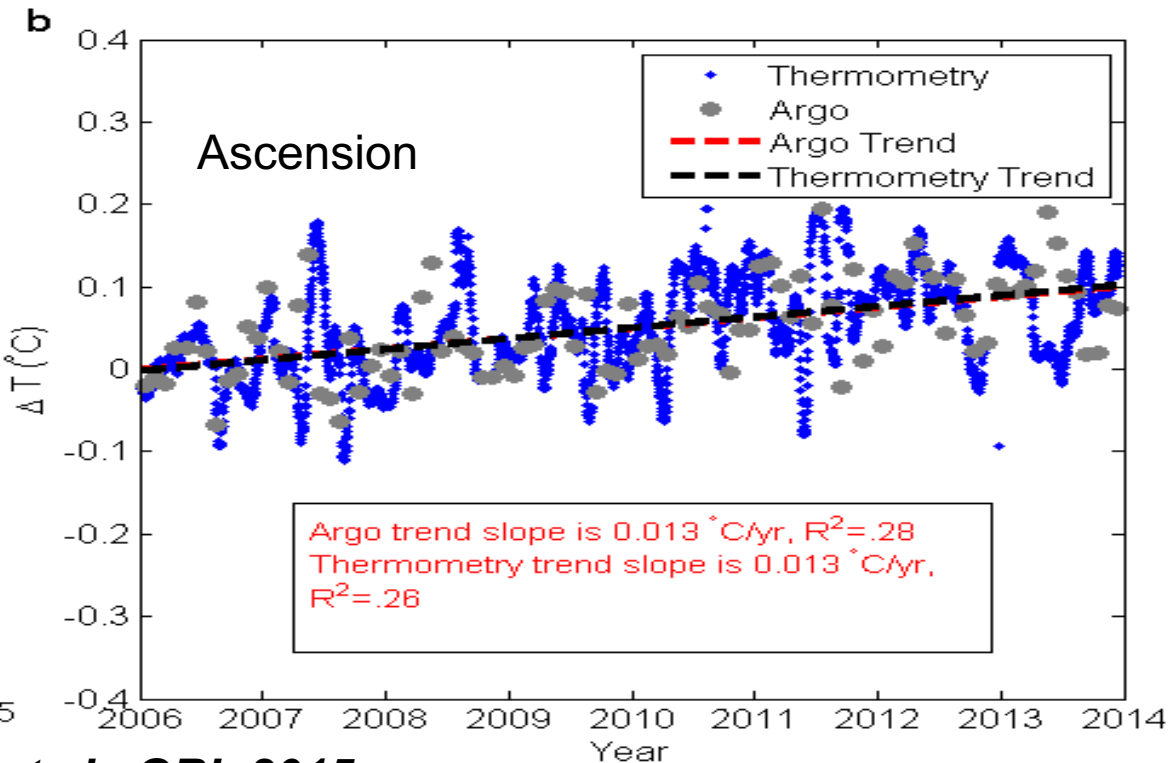
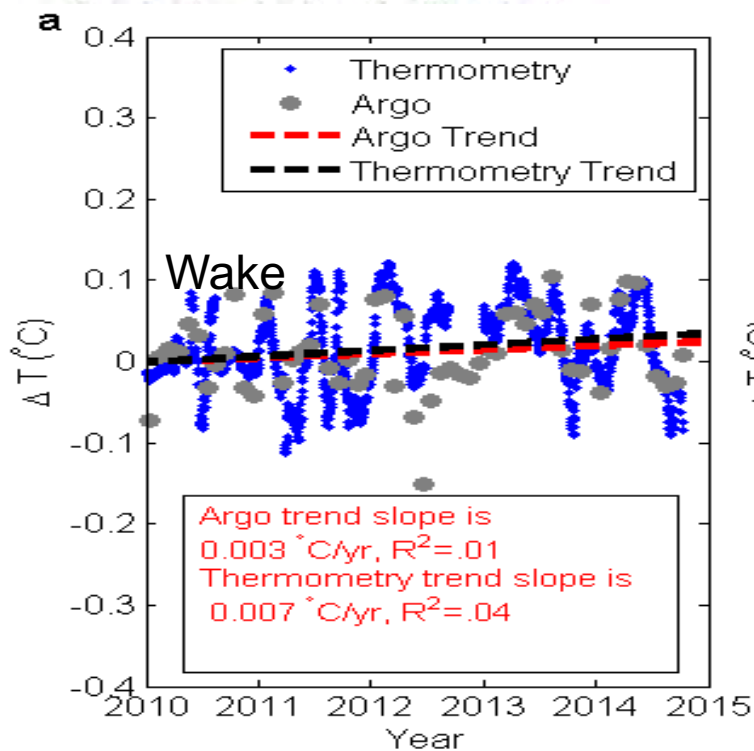
(Roemmich, D. and J. Gilson, 2009)

Estimating Temperature changes:  $\frac{\Delta t}{t_0} = -\frac{\Delta c}{c_0} = \alpha \Delta T \left(1 + \frac{\mu\beta}{\alpha}\right)$  (Munk et al. 2009)

From baseline sound speed profile



**Good match between Passive thermometry vs. Argo for linear trend & fluctuations (mesoscale variability ?)-1 week correlation intervals**



Add Peak Tracking  
 Optimization-  
 Factor of 10  
 Reduction in  
 Correlation  
 Time

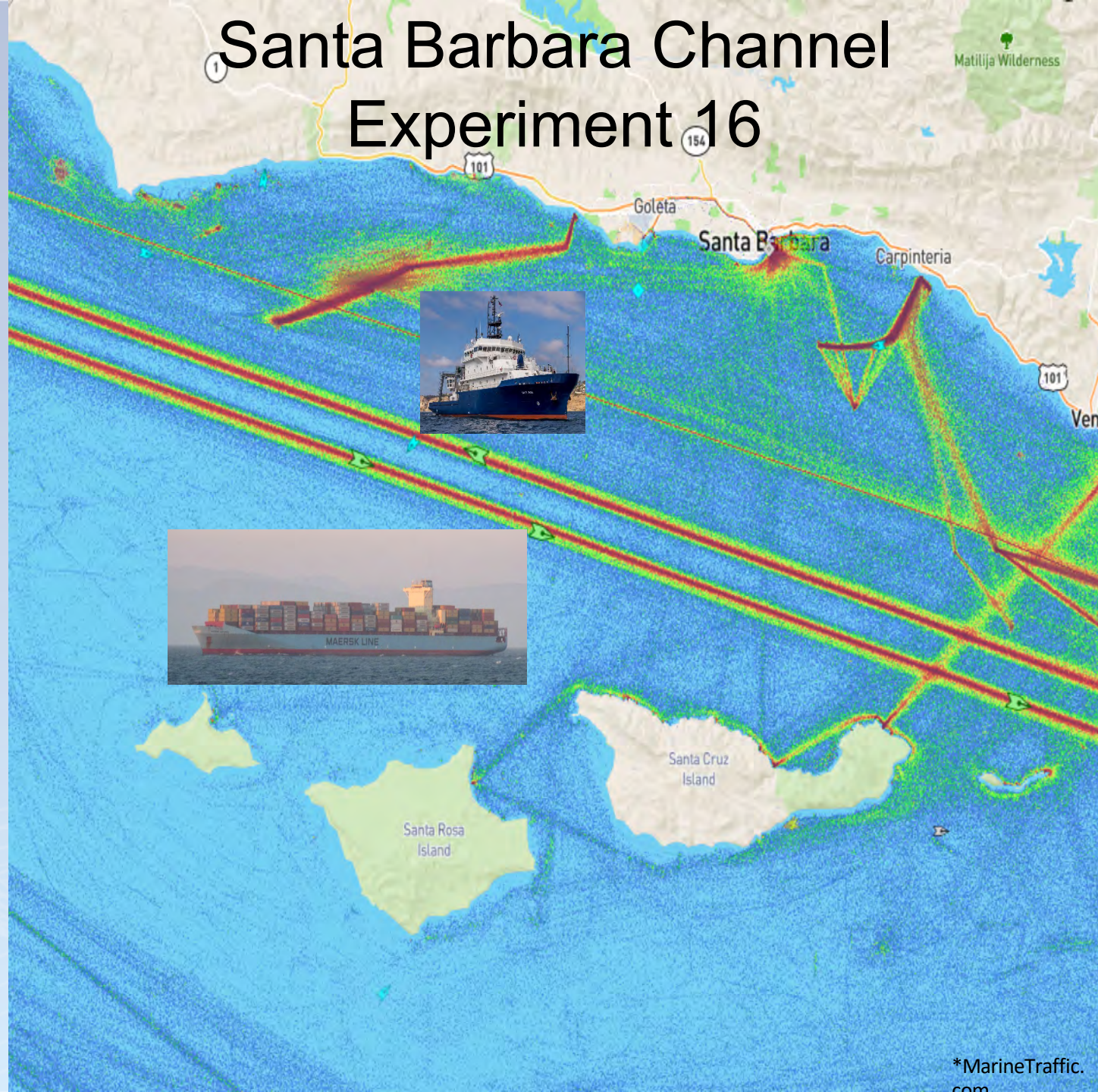
**Woolfe et al.,  
 JASA-EL, 2015**

**STAY  
TUNED**

**Woolfe et al., GRL 2015**



# Santa Barbara Channel Experiment 16

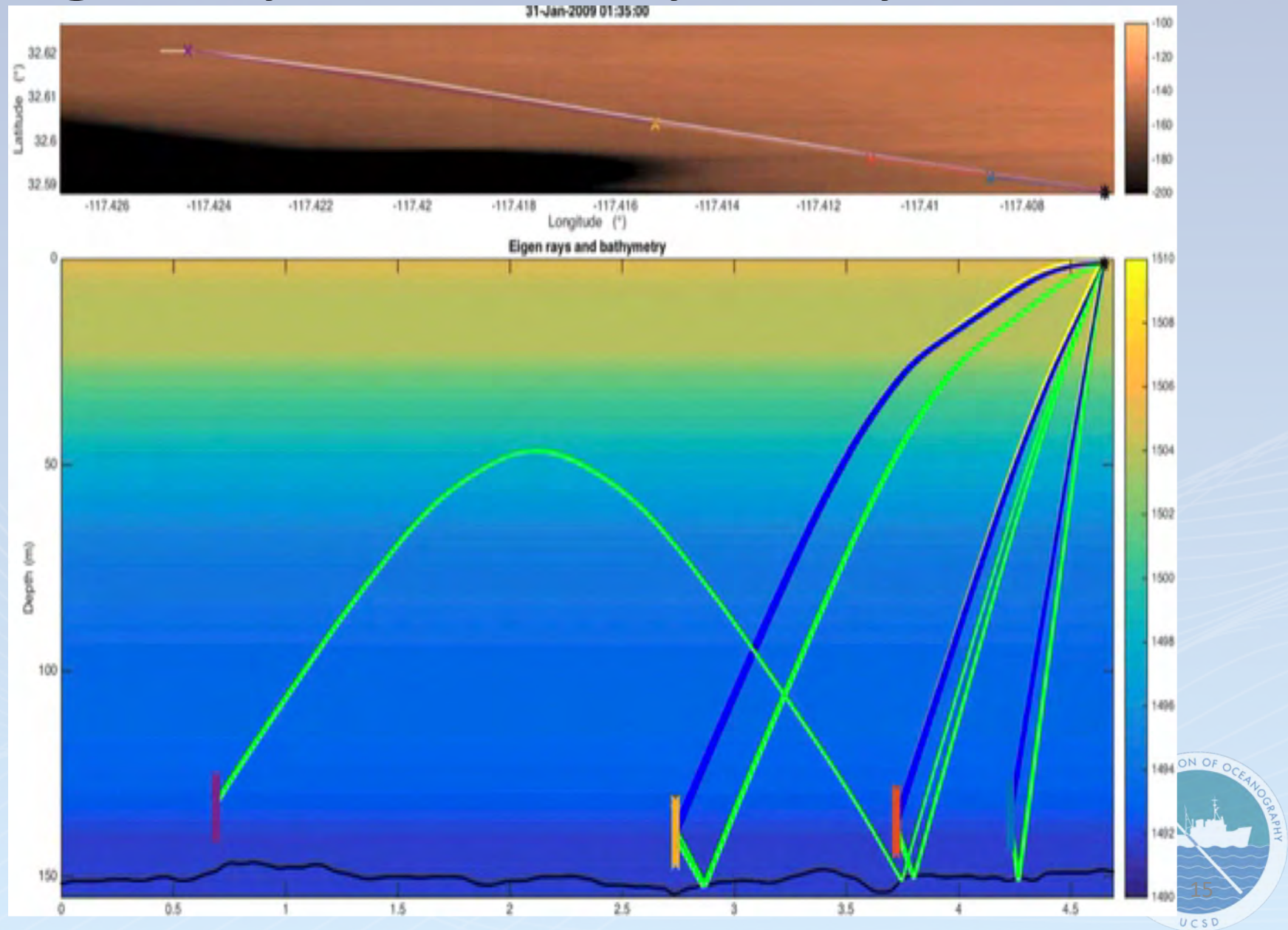


\*MarineTraffic.com

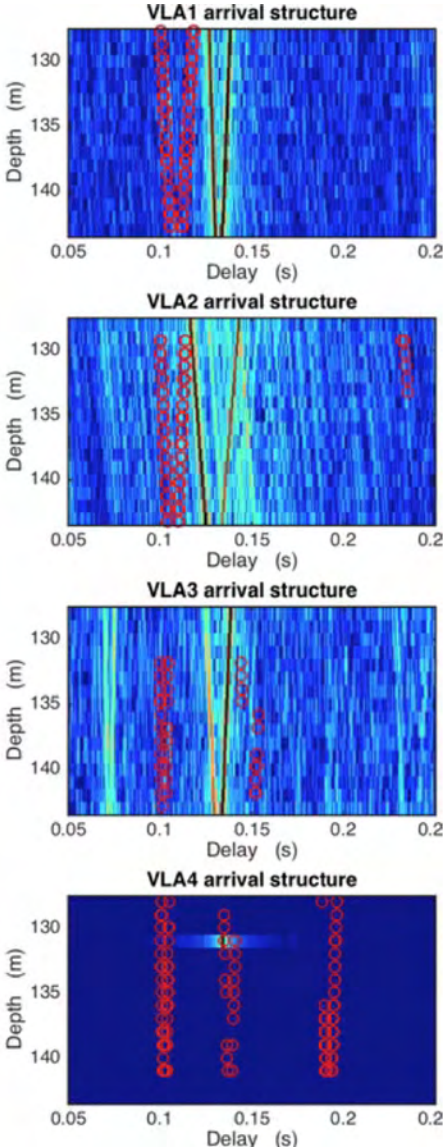
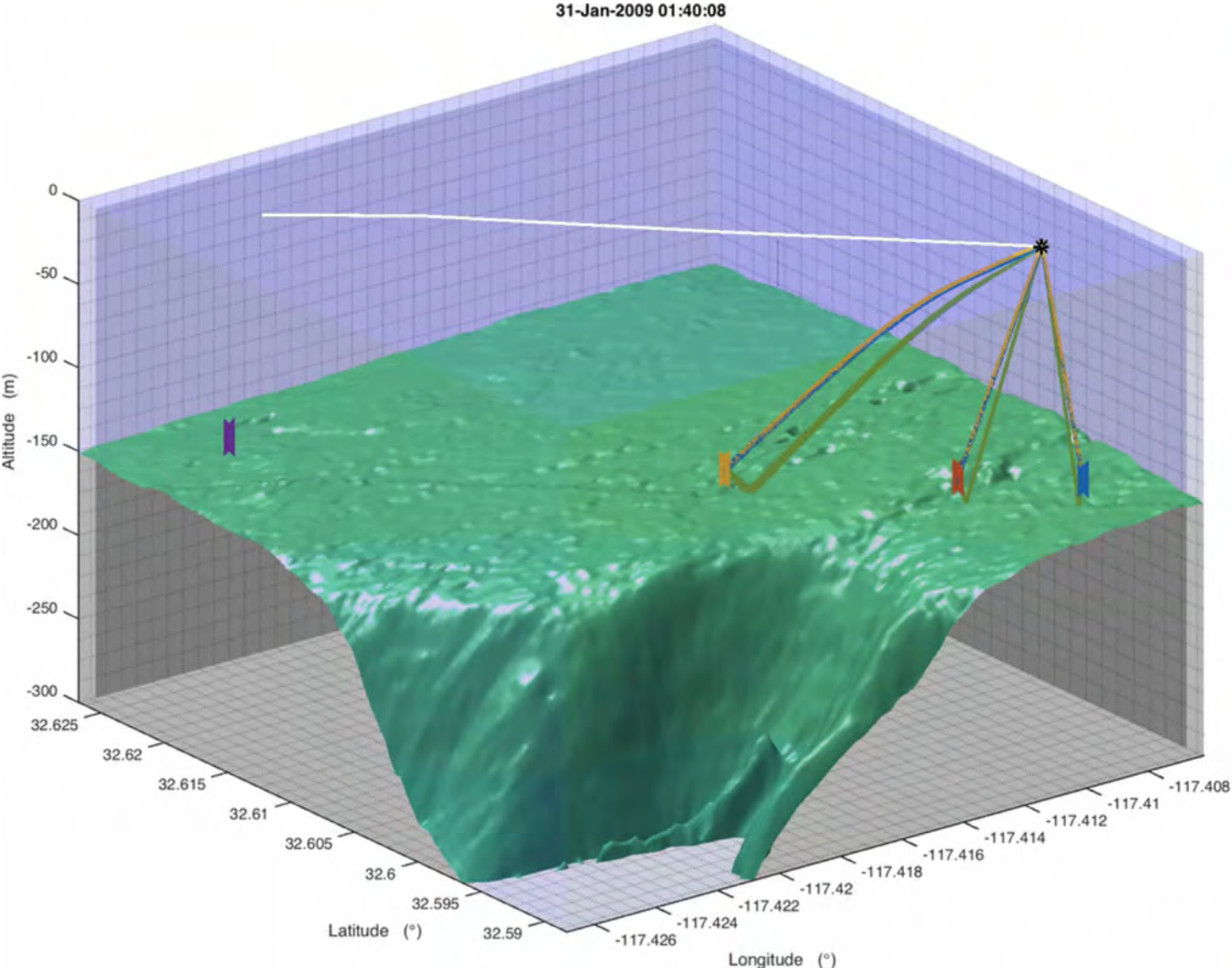




# Eigenrays and Bathymetry (active)



# DATA+DECONVOLUTION+MODEL+AIS



AEL~cm



# Preliminary Moving Tomography Results

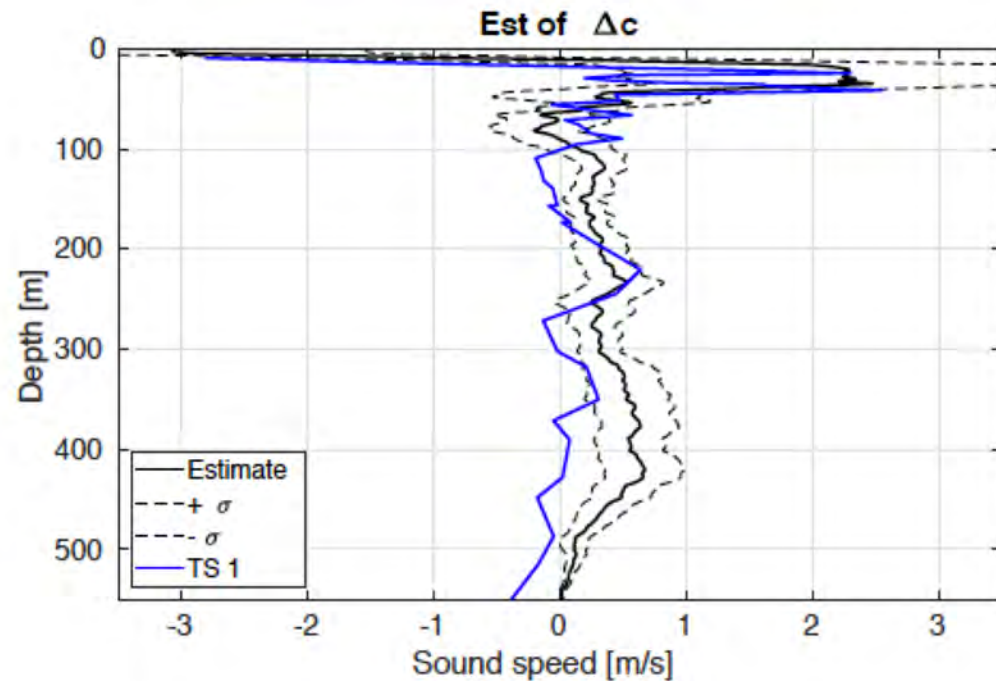


FIG. 4. Inversion results corresponding to the location of thermistor string (TS) 1 showing sound speed perturbation estimate and its standard deviation (calculated from estimated horizontal decorrelation scales).

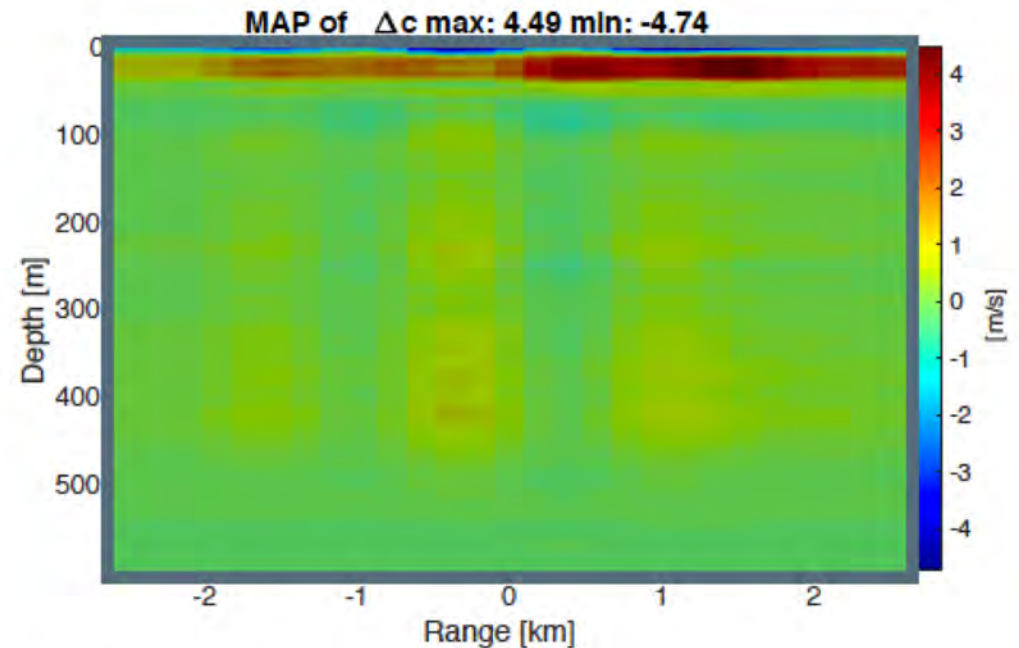


FIG. 5. Sound speed perturbation estimate corresponding to the blue slice shown in Fig. 10.

ACKNOWLEDGMENTS

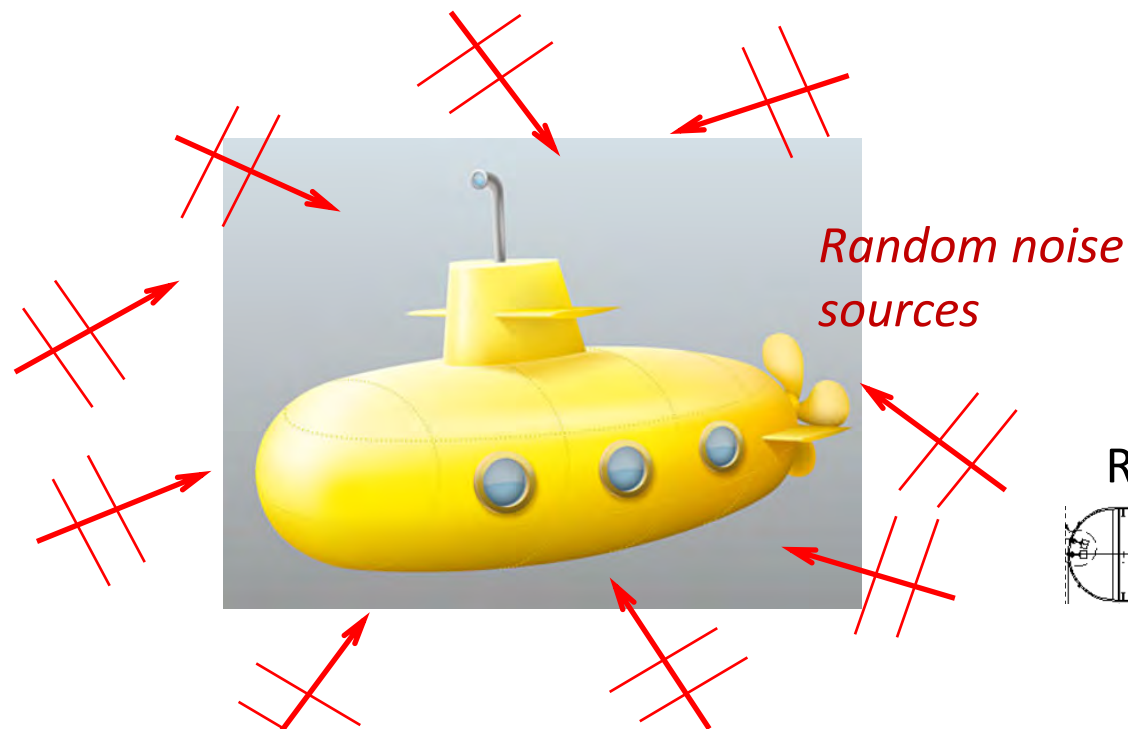
MOVING ON:

NOISE and STRUCTURAL ACOUSTICS:

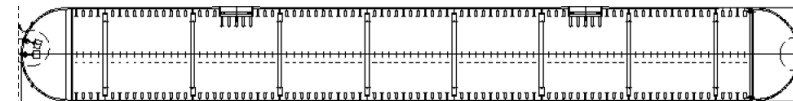
# Holographic array for determining structural acoustic properties

# OBJECTIVES

- Construct a laboratory to measure the structural Green's function of an elastic object (structural impedance matrix) excited by an external random noise field, by using measurements of surface velocity & pressure.
- With this information predict the scattered field for any coherent incident field condition, **in any medium**.



Ribbed cylindrical shell (C50)



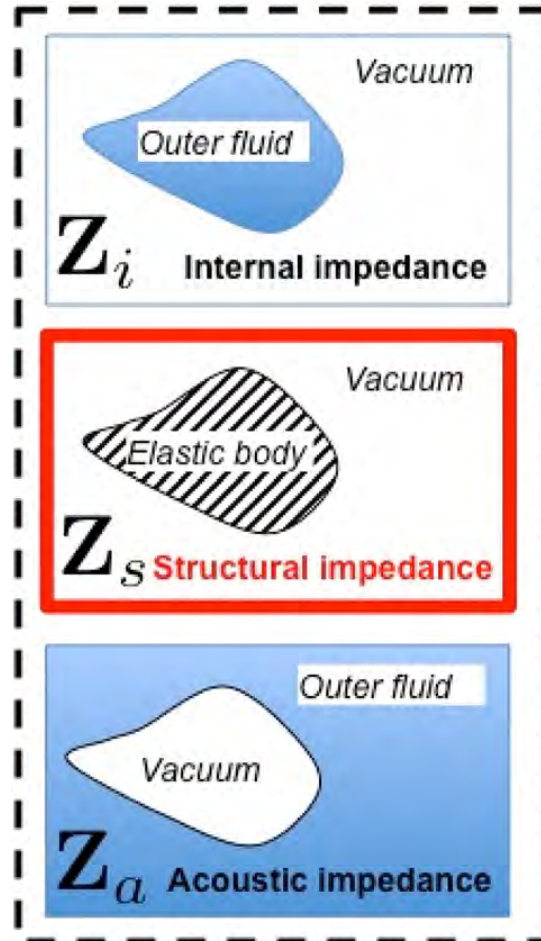
Rakotonarivo, Kuperman, Williams (2013), *Prediction of a body's structural impedance and scattering properties using correlation of random noise*, JASA (2013)

# OUTLINE

- THEORY BEHIND MEASUREMENTS
- LABORATORY COMPONENTS
- MEASUREMENTS AND COMPARISON WITH FEM

# INTRODUCTION-1

We need three *surface* impedances to characterize the scattering from an elastic body given the incident pressure field:



$$\mathbf{p} = \mathbf{p}_i + \mathbf{p}_s \text{ and } \mathbf{v} = \mathbf{v}_i + \mathbf{v}_s$$

$$\rightarrow \mathbf{p}_i = -\mathbf{Z}_i \mathbf{v}_i \text{ Incident Fields}$$

(i.e. Interior Neumann Green fcn.)

$$\rightarrow \mathbf{p} = -\mathbf{Z}_s \mathbf{v} \text{ Total Fields}$$

$\mathbf{Z}_s$  is the Structural Impedance

$$\rightarrow \mathbf{p}_s = \mathbf{Z}_a \mathbf{v}_s \text{ Scattered Fields}$$

(i.e. Exterior Neumann Green fcn.)

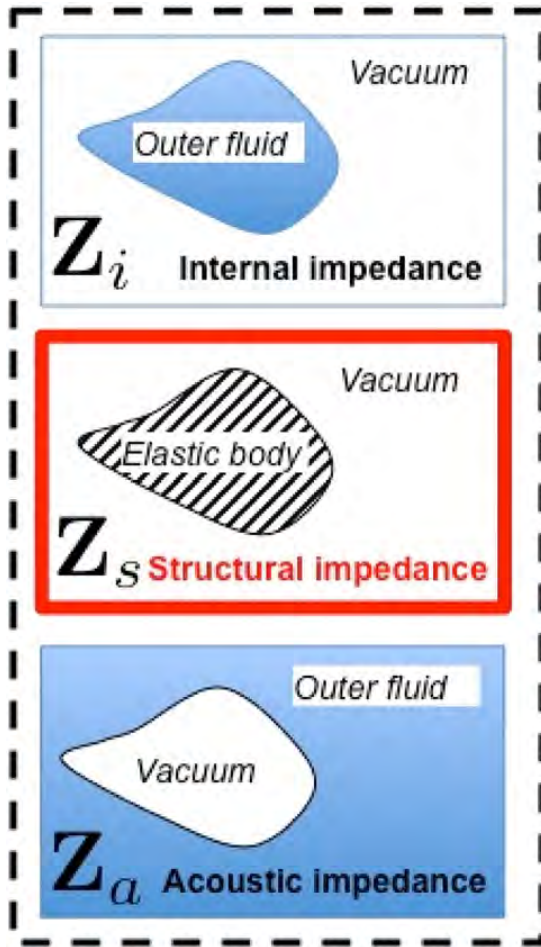


# INTRODUCTION-2

Simple manipulation of the impedances yields<sup>1</sup>,

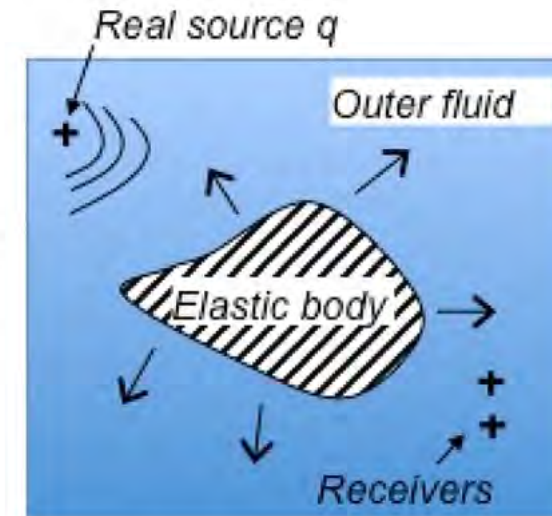
where  $\mathbf{p}_s$  is the scattered field **on the surface**:

$$\mathbf{p}_s = \underbrace{\left( \frac{1}{\mathbf{Z}_a} + \frac{1}{\mathbf{Z}_s} \right)^{-1} \left( \frac{1}{\mathbf{Z}_i} - \frac{1}{\mathbf{Z}_s} \right)}_{Q = \text{Scattering Matrix}} \mathbf{p}_i$$



$\mathbf{Z}_s$  contains the physics of the elastic body when placed in a vacuum

NOTE:  $\mathbf{Y} = \mathbf{Z}^{-1}$



Scattered field at the receivers

<sup>1</sup>Bobrovntiskii (2006), *A new impedance-based approach to analysis and control of sound scattering*

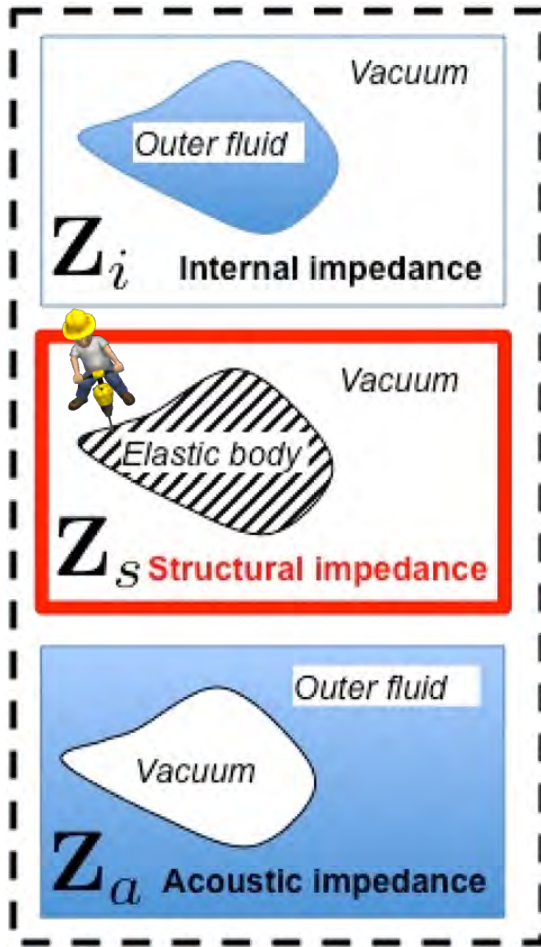
Borgiotti (1990); Gaumont et Yoder (1995); Lucifredi and Schmidt (2004); Bobrovntskii (2006)

# INTRODUCTION-2

Simple manipulation of the impedances yields<sup>1</sup>,

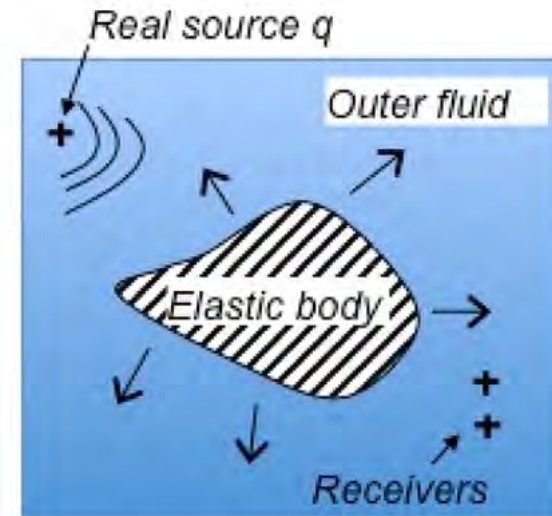
where  $\mathbf{p}_s$  is the scattered field **on the surface**:

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Scattered field at the receivers

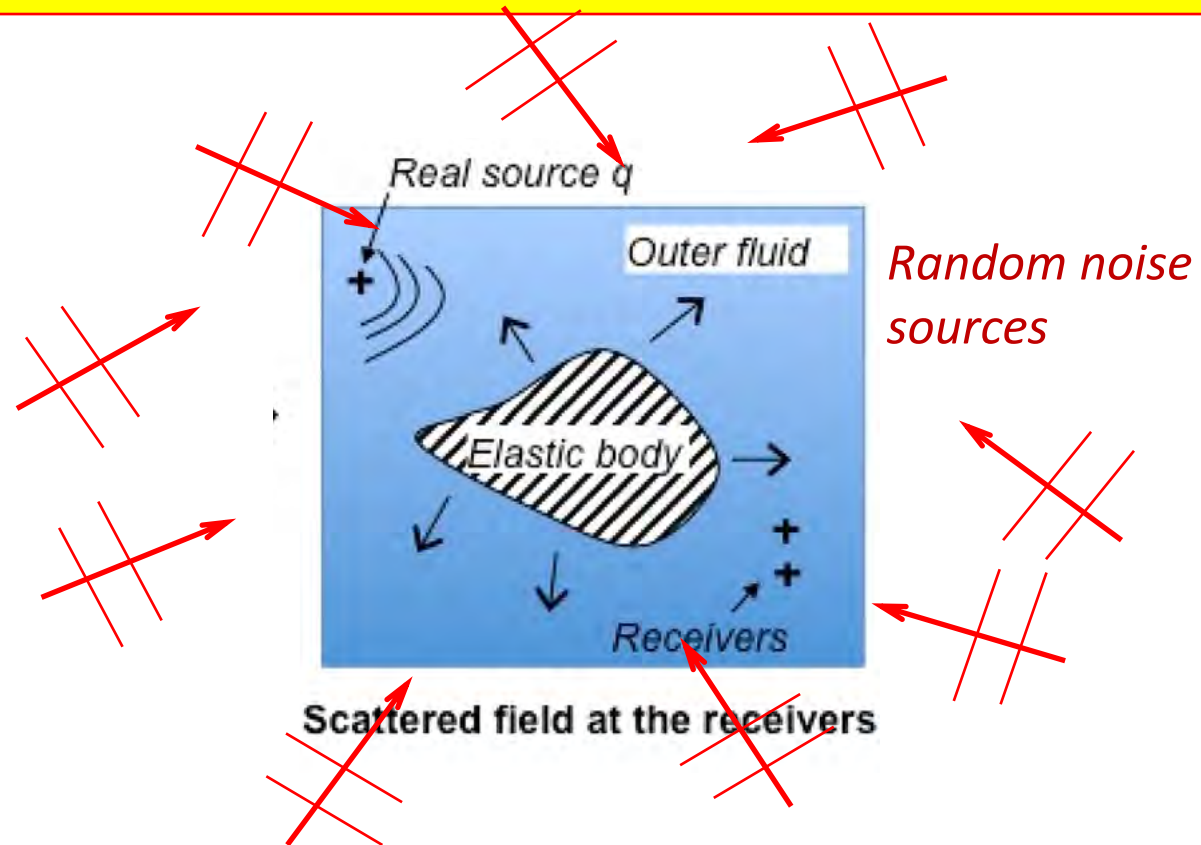
<sup>1</sup>Bobrovntiskii (2006), *A new impedance-based approach to analysis and control of sound scattering*

Borgiotti (1990); Gaumont et Yoder (1995); Lucifredi and Schmidt (2004); Bobrovntiskii (2006)

# SO, WE NEED TO MEASURE

 $Z_s$ 

- Measure :  $Z_s$  the elastic object's structural impedance matrix by placing it in a random noise field and measuring surface normal velocity and pressure. (Scattered field "loaded object then easily determined\*)
- \* Bobrovntiskii (2006), Rakotonarivo, Williams, Kuperman (2013)



# MEASUREMENT of the STRUCTURAL IMPEDANCE

## Cross-Correlation method to predict $Z_s$ from the noise

$$\mathbf{p} = -\mathbf{Z}_s \mathbf{v}$$

Multiply both sides by

$$\mathbf{p}^H$$

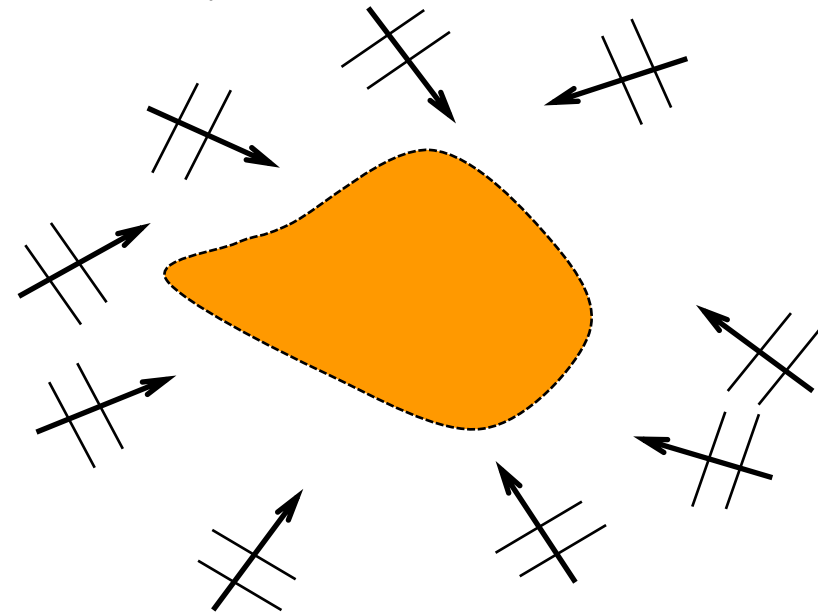
Outer Products, cross-correlations of all sensor pairs, are averaged over  $L$  realizations

$$\langle \mathbf{p} \mathbf{p}^H \rangle = -\mathbf{Z}_s \langle \mathbf{v} \mathbf{p}^H \rangle$$

Pressure field at  $N$  surface nodes

Normal velocity at  $N$  surface nodes

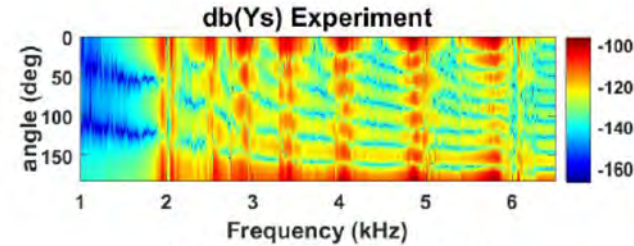
$L$  realizations (random noise sources)



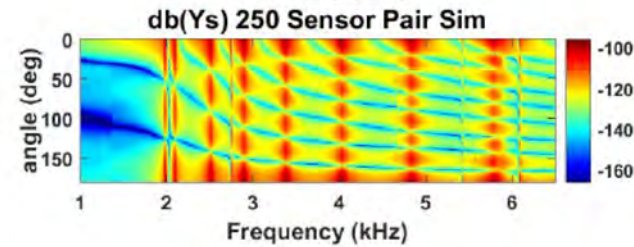


## LAST TIME: Proof of Concept: Initial on-the-object measurements

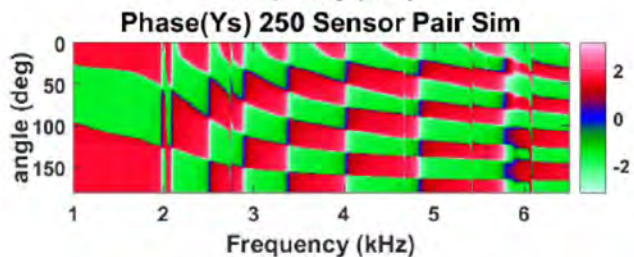
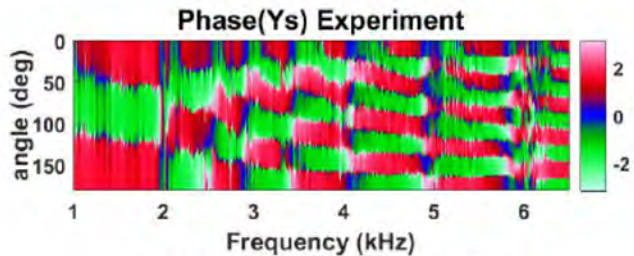
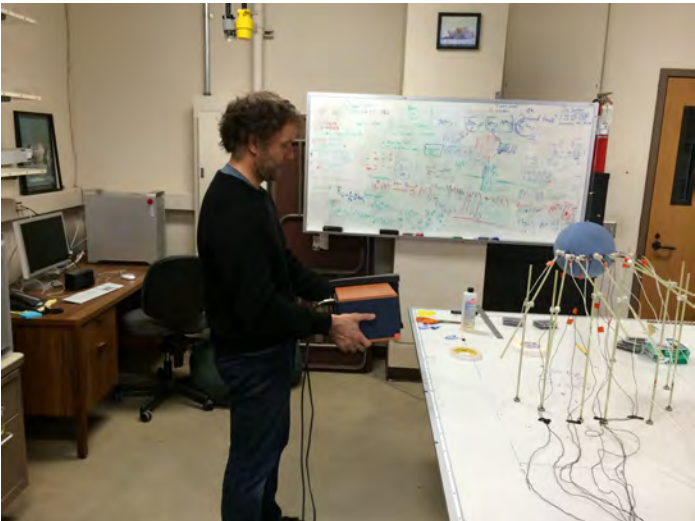
- Measurements with only 8+8 sensors on the surface of spherical shell placed in noise
- Symmetry(not possible for arbitrary object) used for data analysis



- Successful construction of Ys
- Insufficient accuracy to get S-matrix in water



- **FOR ARBITRARY SCATTERER NEED ABOUT 250 ACCELS AND MIKES**

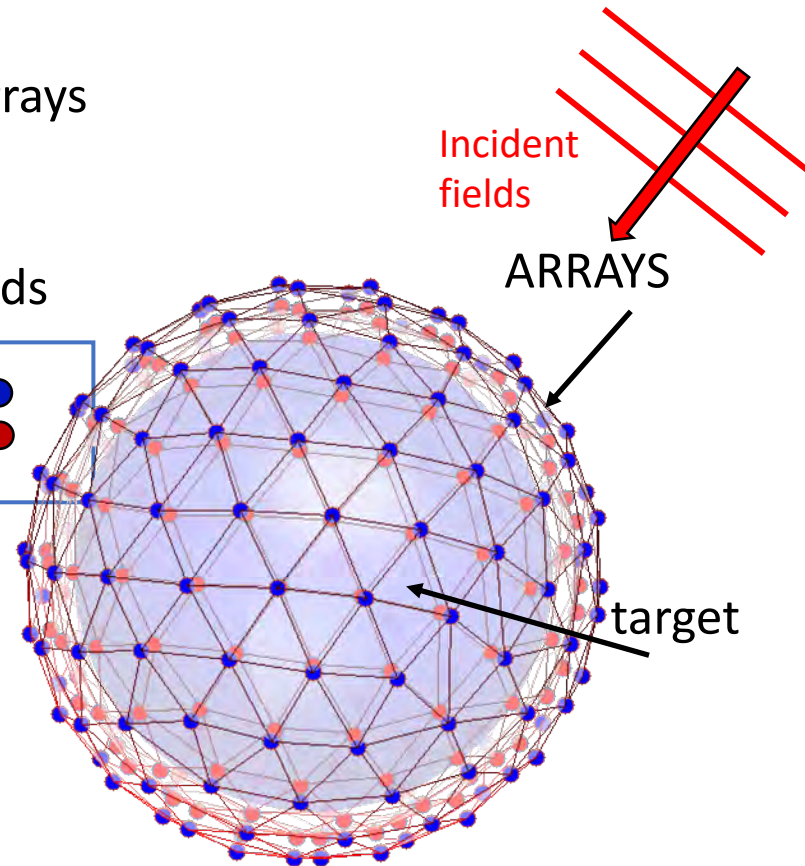


# CONSTRUCT A Dual Surface Array

*We require a measurement of the total pressure and normal velocity on the surface of a Target*

1. Use two conformal (~250-element) arrays  
“Holographic Surfaces”
2. (FST) Separate Incident/Scattered Fields
3. Compute Pressure and Velocity on  
object surface
4. Compute Ys...

Outer Mic ●  
Inner Mic ●



HOW?

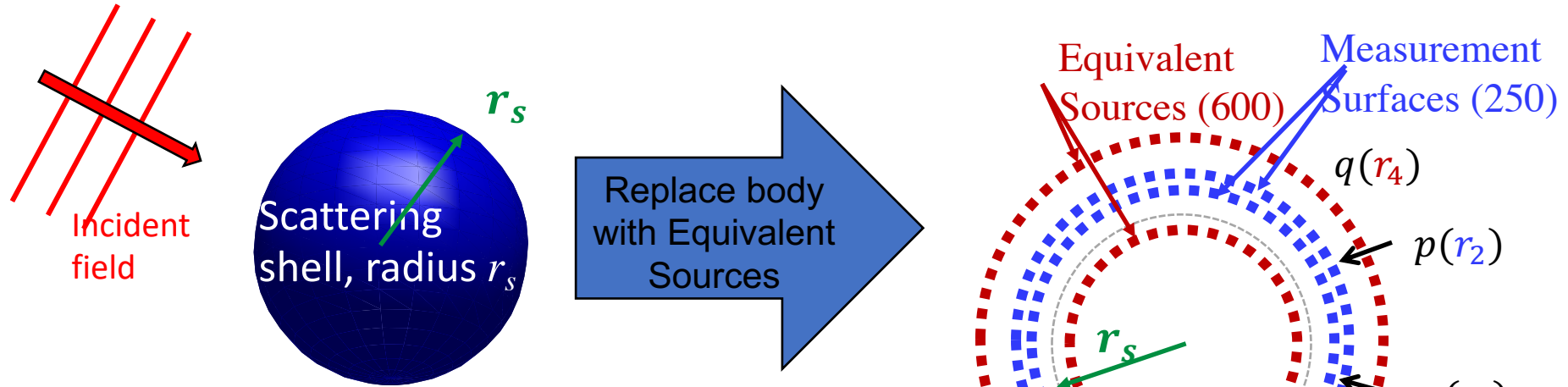


Dual conformal mic surfaces



# Field Separation (FST) using **Equivalent Source Method**:

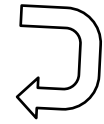
We need to find  $p$  and  $v$  on surface of object



- NAH SURFACES: Two conformal measurement arrays ( $p(r_1), p(r_2)$ ) close to elastic target
- Two **equivalent source surfaces** of unknown strengths,
  - $q(r_3)$  inside for scattered field
  - $q(r_4)$  outside for incident field
- ( $p(r_1), p(r_2)$ ) are sums of incident and radiated fields so we can invert for  $q$ 's using free field Green's functions

$$\begin{bmatrix} G_{31} & G_{41} \\ G_{32} & G_{42} \end{bmatrix} \begin{bmatrix} q(r_3) \\ q(r_4) \end{bmatrix} = \begin{bmatrix} p(r_1) \\ p(r_2) \end{bmatrix}$$

$$\begin{bmatrix} q(r_3) \\ q(r_4) \end{bmatrix} = \begin{bmatrix} G_{31} & G_{41} \\ G_{32} & G_{42} \end{bmatrix}^{-1} \begin{bmatrix} p(r_1) \\ p(r_2) \end{bmatrix}$$



- Knowing  $q$ 's we propagate both fields to surface to get total  $\mathbf{p}(\mathbf{r}_s)$  and  $\mathbf{v}(\mathbf{r}_s)$

$$p_i(\mathbf{r}_s) = \sum_{\mathbf{r}_4} G(\mathbf{r}_s, \mathbf{r}_4) q(\mathbf{r}_4) \quad v_i(\mathbf{r}_s) = \frac{1}{i\omega\rho} \frac{\partial}{\partial n(\mathbf{r}_s)} \sum_{\mathbf{r}_4} G(\mathbf{r}_s, \mathbf{r}_4) q(\mathbf{r}_4)$$

$$p_s(\mathbf{r}_s) = \sum_{\mathbf{r}_3} G(\mathbf{r}_s, \mathbf{r}_3) q(\mathbf{r}_3) \quad v_s(\mathbf{r}_s) = \frac{1}{i\omega\rho} \frac{\partial}{\partial n(\mathbf{r}_s)} \sum_{\mathbf{r}_3} G(\mathbf{r}_s, \mathbf{r}_3) q(\mathbf{r}_3)$$

- **ISSUE: TOTAL VELOCITY on SURFACE is VERY SMALL. So Use:** Elastic Component of Velocity (Blocked Pressure Subtraction)

# WHAT WE'RE USING: Laboratory Equipment

- Custom Dual Digital MEMS Microphone sensors



- Custom Data Aggregator Boards



- Digital only DAQ – No amplifier/conditioners/ADC required



NI myRIO  
(small FPGA)



Digilent Digital  
Discovery  
(small FPGA)



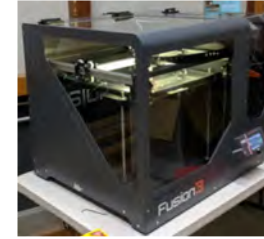
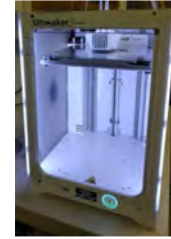
NI PXIe system  
(+4x large FPGAs)



- NVIDIA DGX-Station GPU processing system



- 3x 3D Printers



- 2x 3D Scanners



- Scanning Laser Doppler Vibrometer



- Robotic manipulator

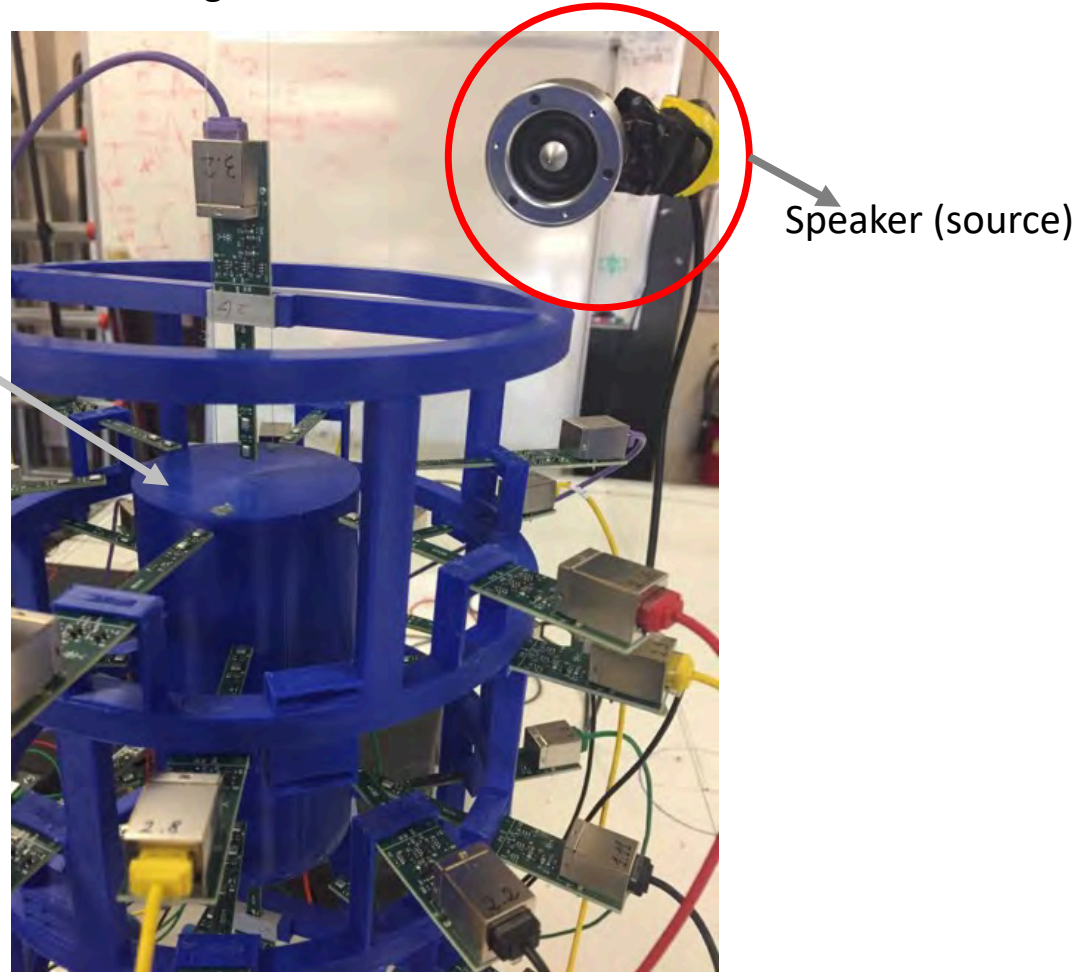


## Measurements with capped cylindrical target

- Measurements with 32 sensors mounted on the scaffold, at 5mm and 15mm from the cylindrical target
- A white noise source (0.5-24 kHz bandwidth) at 340 different locations was used to generate the incident acoustic field around the target

- Capped Cylindrical Target:

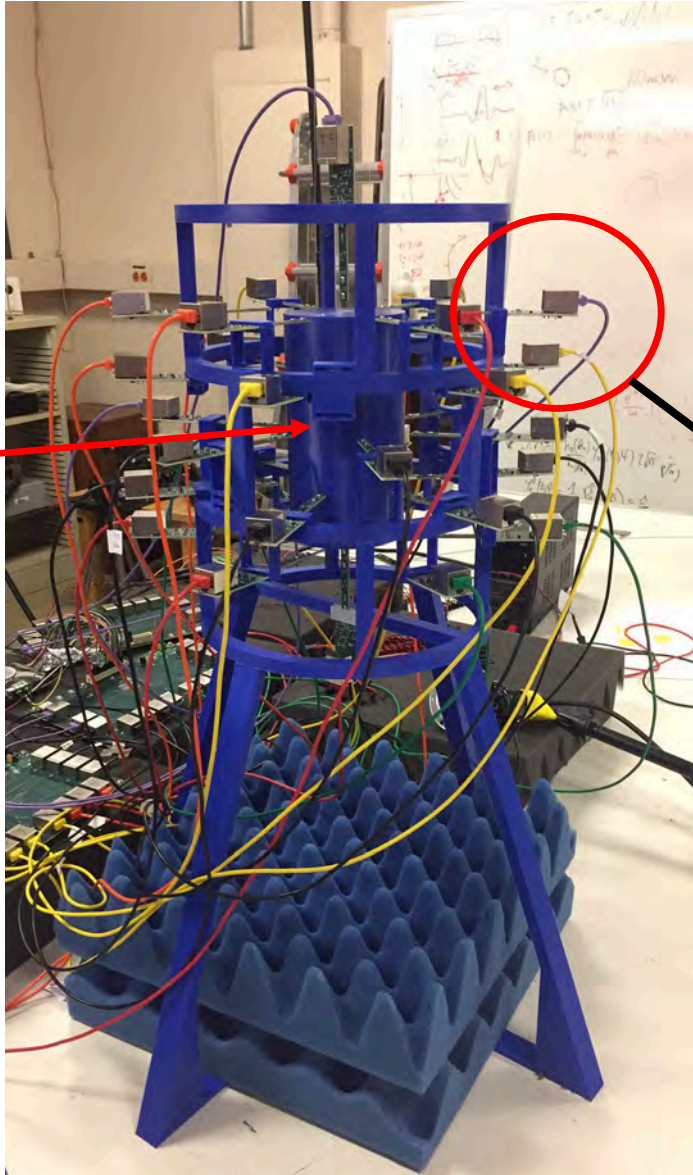
Height: 0.15 m  
Thickness: 0.0025 m  
Outer radius: 0.04 m  
Material: PLA



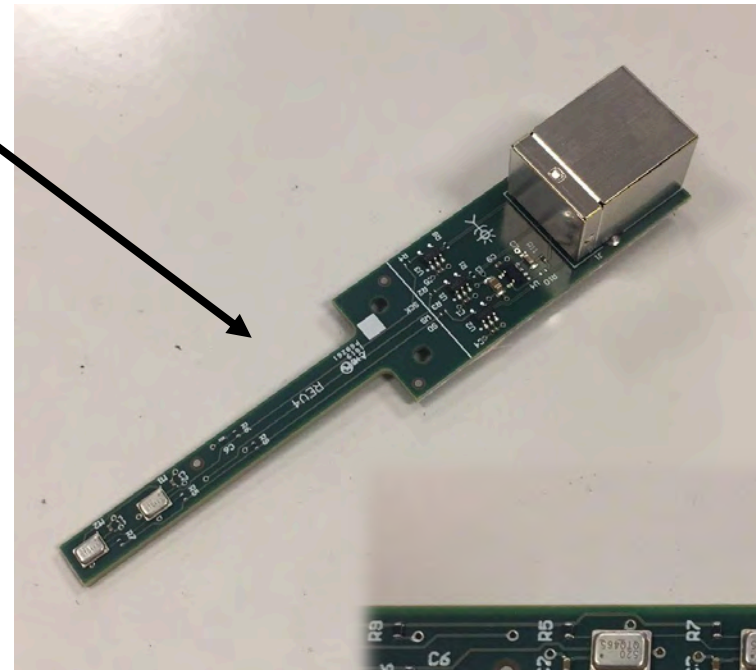


# Experimental Setup

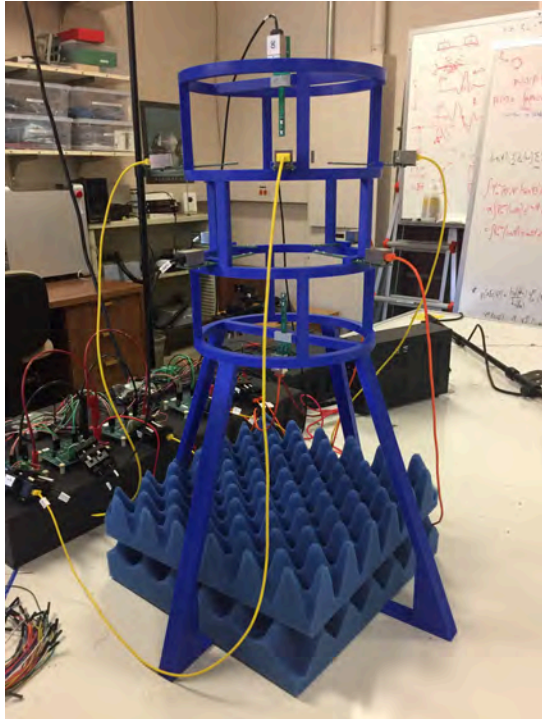
- Measurements with 10 or 32 sensors mounted on the scaffold, at 5mm and 15mm from the cylindrical target



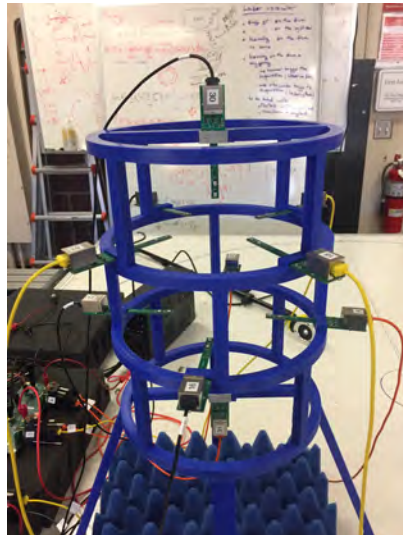
- Tests performed with and without target using a white noise source at different locations around the scaffold
- Pairs of MEMS sensors were used to record the acoustic signals (hologram surfaces)



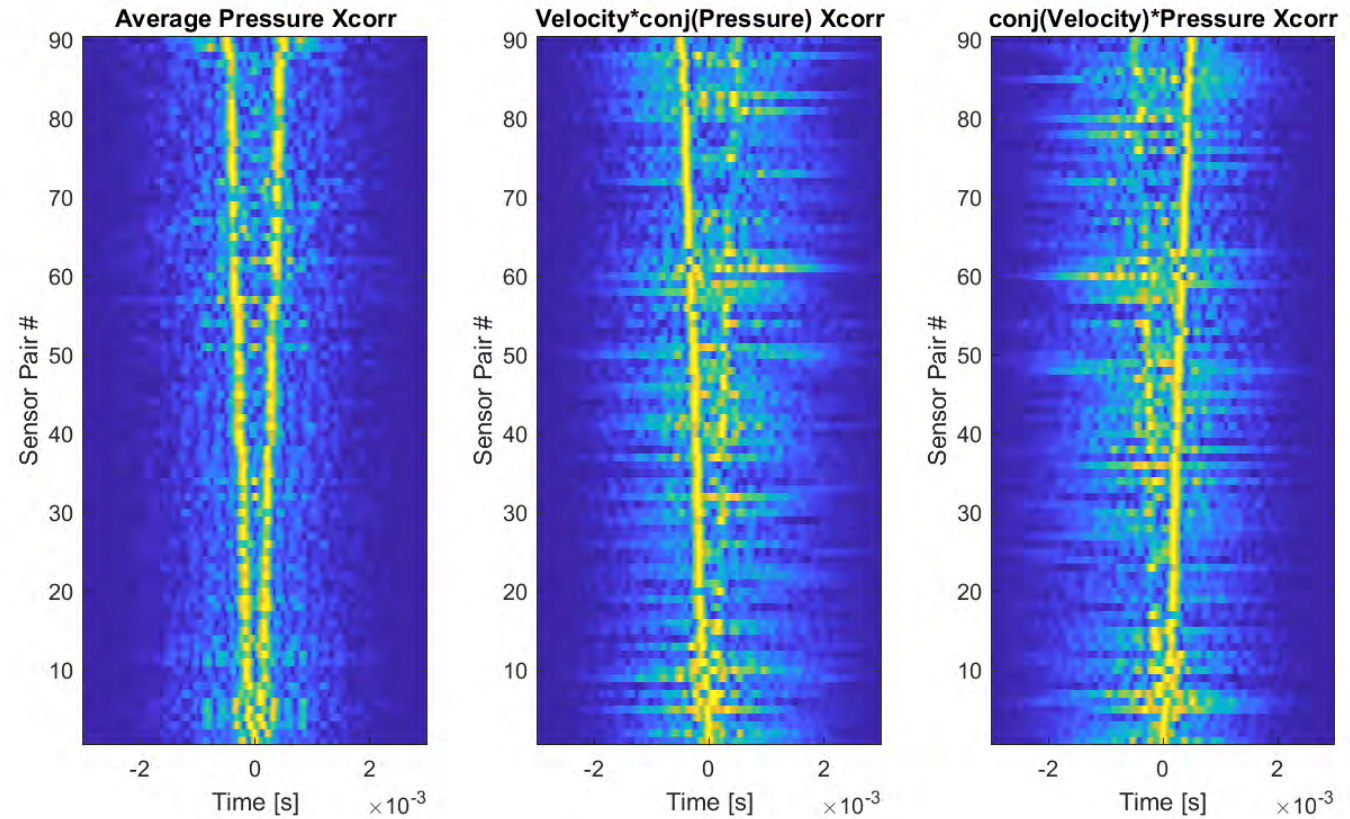
## Measurements with no target (scaffold only)



- Measurements with only 10 sensors mounted on the scaffold and no cylindrical target (305 source positions, white noise 0.5-24 kHz bandwidth)
- Reconstruction of the Green's function between all sensor pairs does not seem to be affected by the presence of the scaffold



Cross-correlations with no target (scaffold only)





# Reconstructed Pressure and Velocity at the Target Surface

$f = 950 \text{ Hz}$

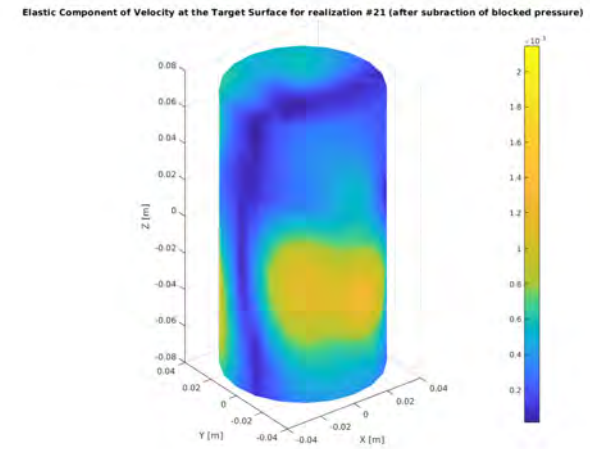
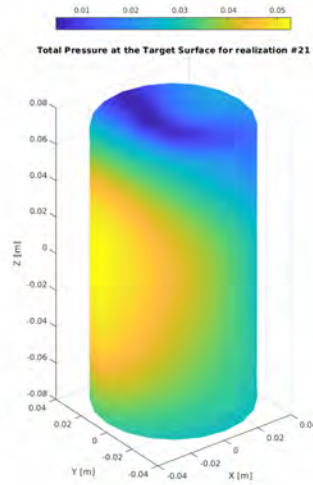
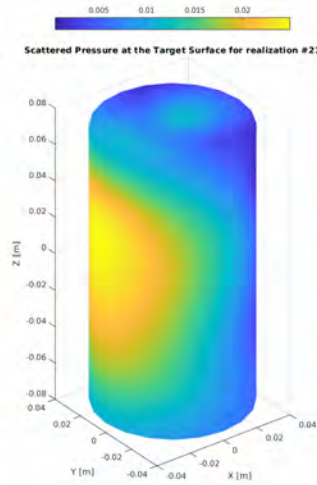
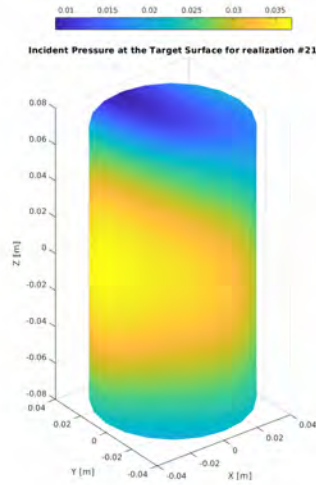
Incident Pressure

Scattered Pressure

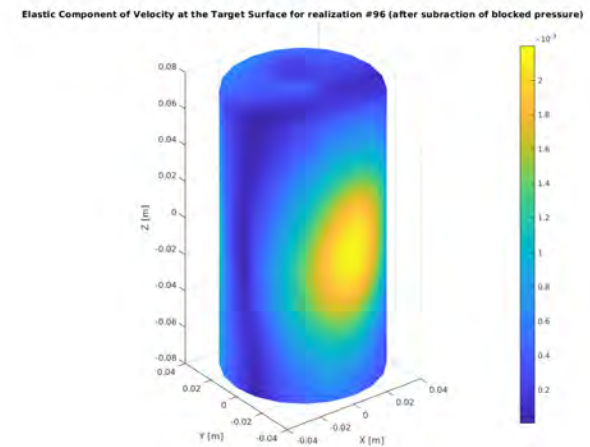
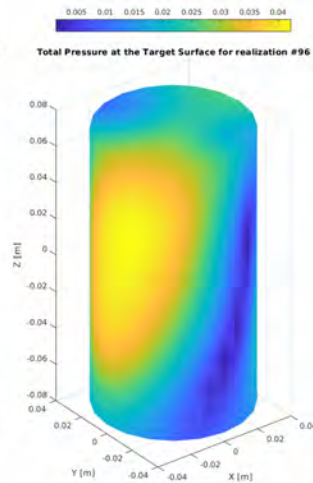
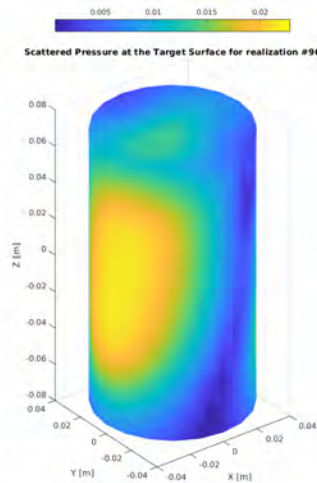
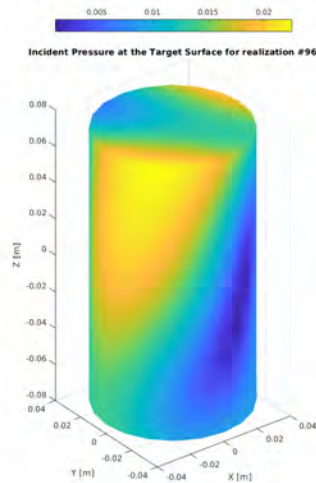
Total Pressure

Elastic Velocity

Source Position # 21



Source Position # 96





# FEM Simulation of the Capped Cylindrical Target

## ➤ Cylinder Properties:

Height: 0.15 m

Thickness: 0.0025 m

Outer radius: 0.04 m

Inner medium: Air

$\rho = 1.225 \text{ kg/m}^3$

$c = 340 \text{ m/s}$

Cylinder Material: PLA

Young's modulus  $E = 3.5 \text{ Gpa}$

Poisson ratio  $\nu = 0.33$

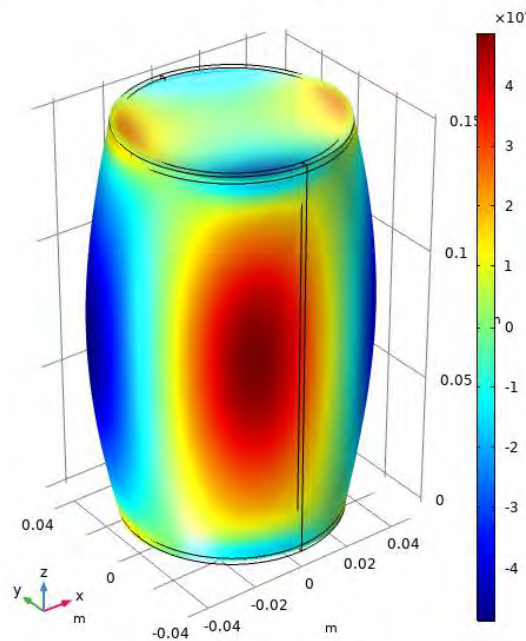
Density  $\rho = 1250 \text{ kg/m}^3$

Lossless shell

## Eigenfrequency Analysis

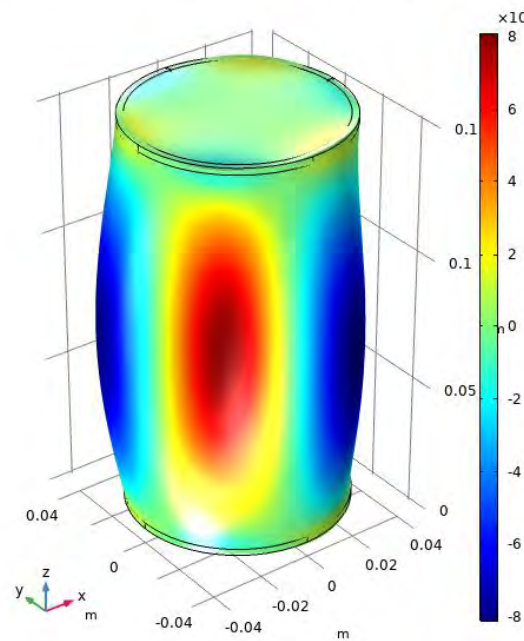
N = 2 at 960 Hz

Eigenfrequency=0.96083 kHz Surface: Pressure (N/m<sup>2</sup>)



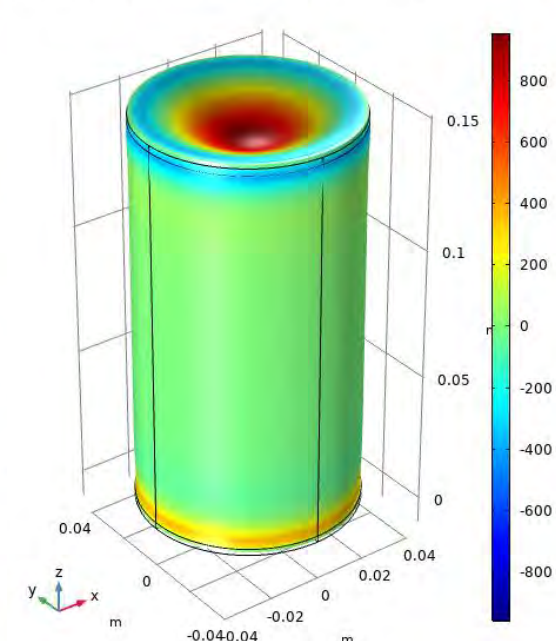
N = 3 at 1200 Hz

Eigenfrequency=1.2005 kHz Surface: Pressure (N/m<sup>2</sup>)



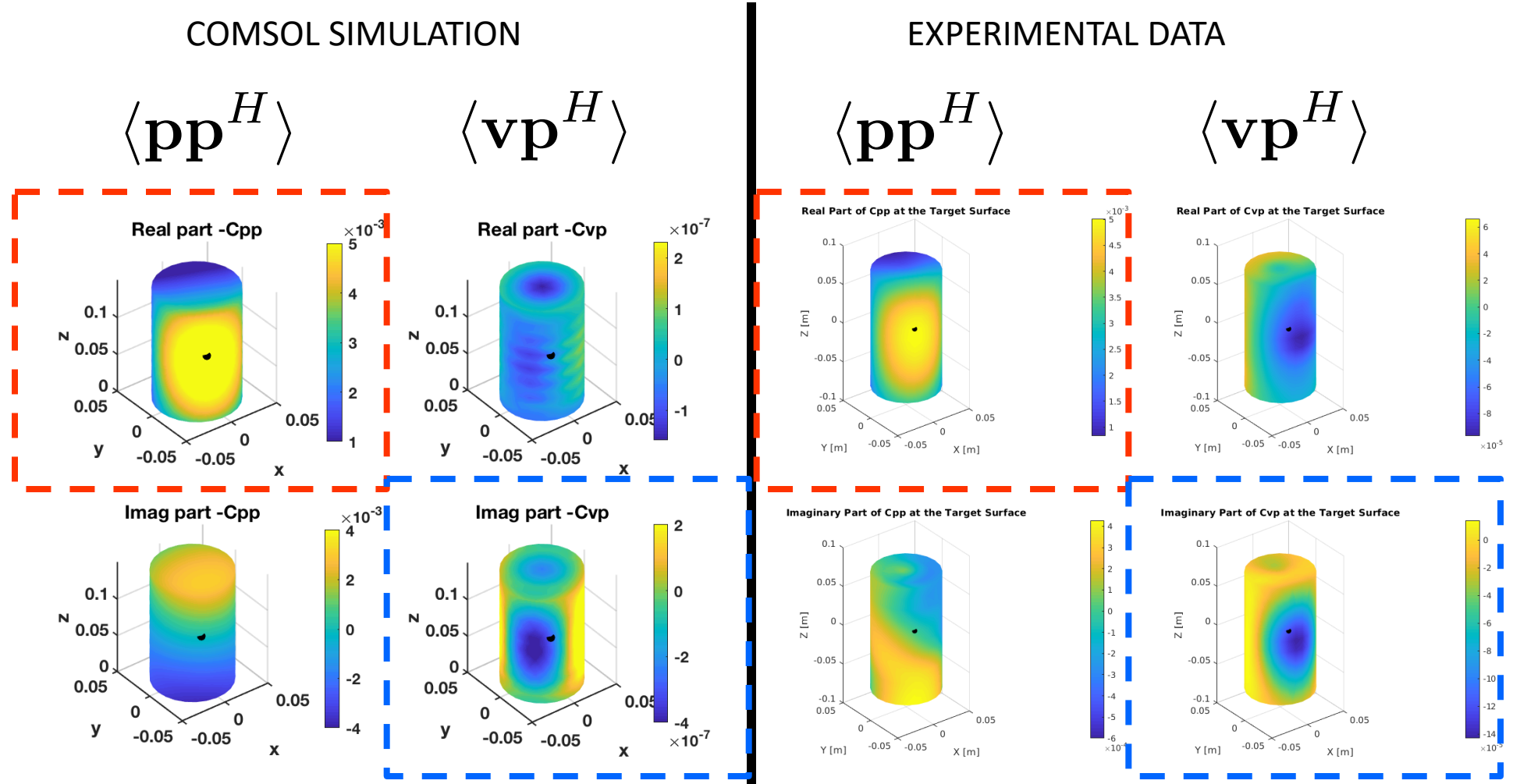
Cap Mode at 1150 Hz

Eigenfrequency=1.1528 kHz Surface: Pressure (N/m<sup>2</sup>)




# Correlation Matrices at the Target Surface

- Comparison of real and imaginary parts of the correlation matrices (pressure-pressure and velocity-pressure) at 950 Hz for simulated and experimental data (black dot = excitation point)

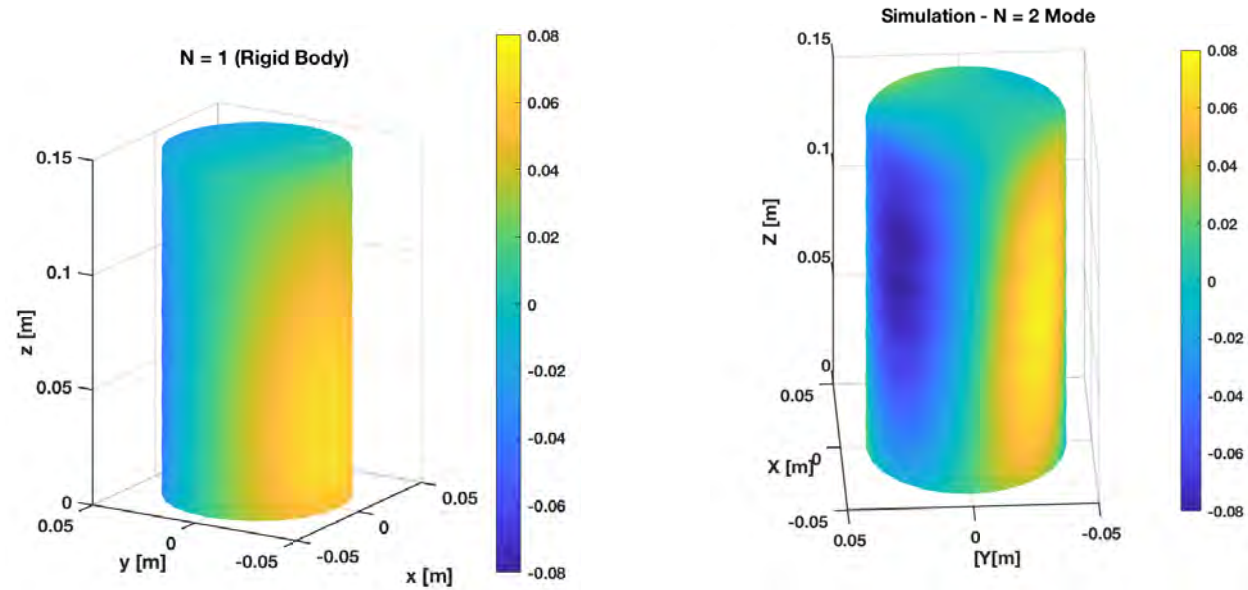


- Good match for the real part of C<sub>pp</sub> and the imaginary part of C<sub>vp</sub>
- Imaginary part of C<sub>pp</sub> and real part of C<sub>vp</sub> not relevant as they are mainly related to medium losses

# Comparison of Eigenmodes between FEM and Experiments

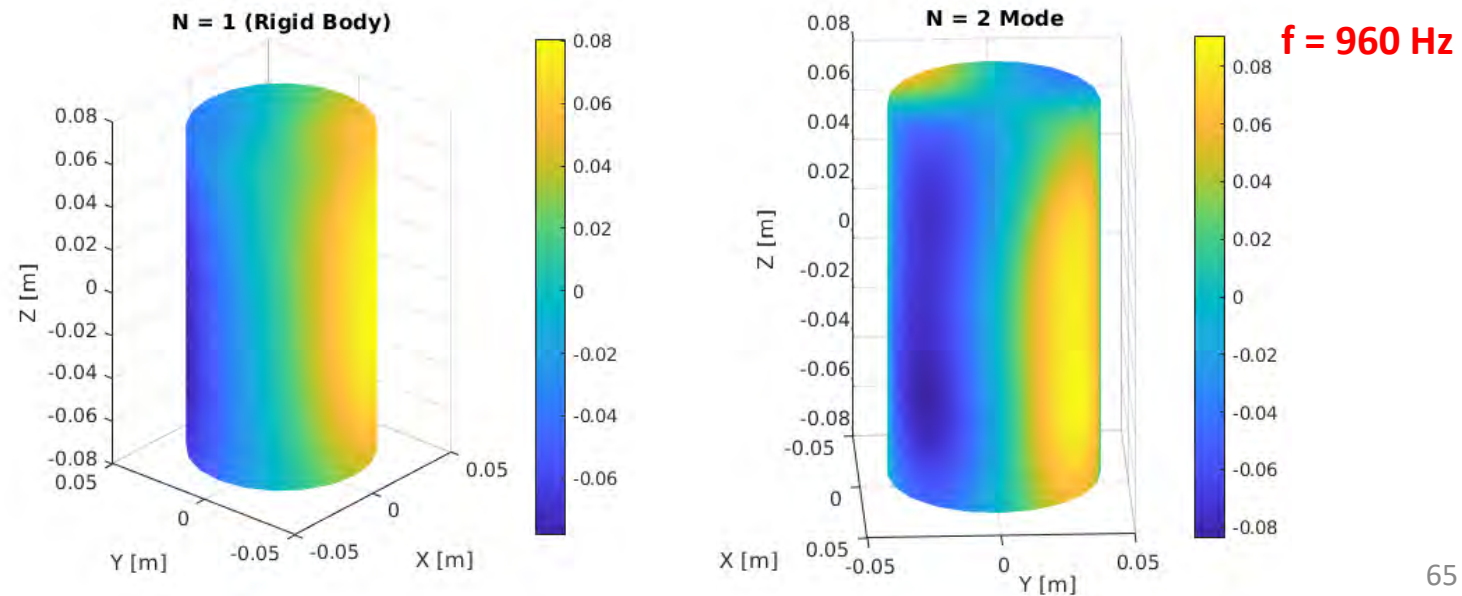
➤ SVD of  $\langle pp^* \rangle = U S V^*$   Columns of U and V are related to the eigenmodes of the target

COMSOL  
SIMULATION

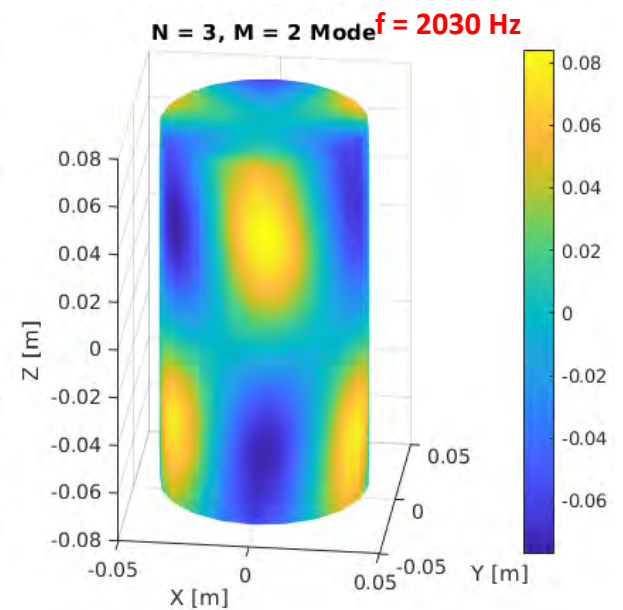
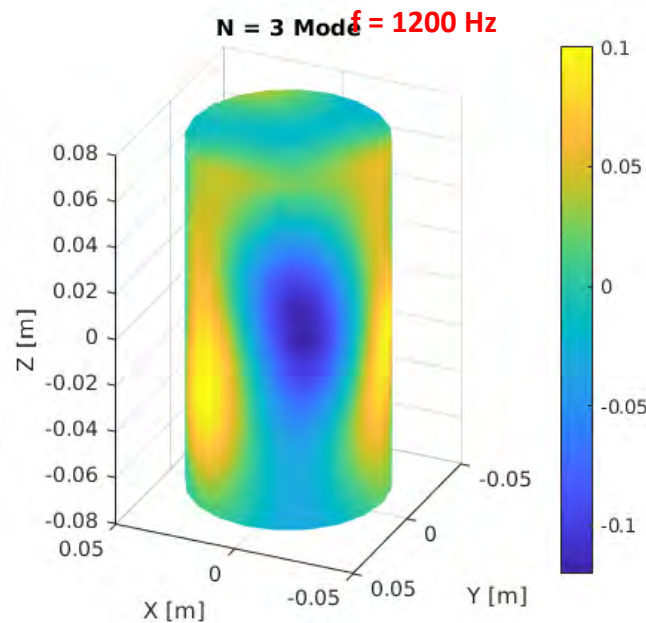
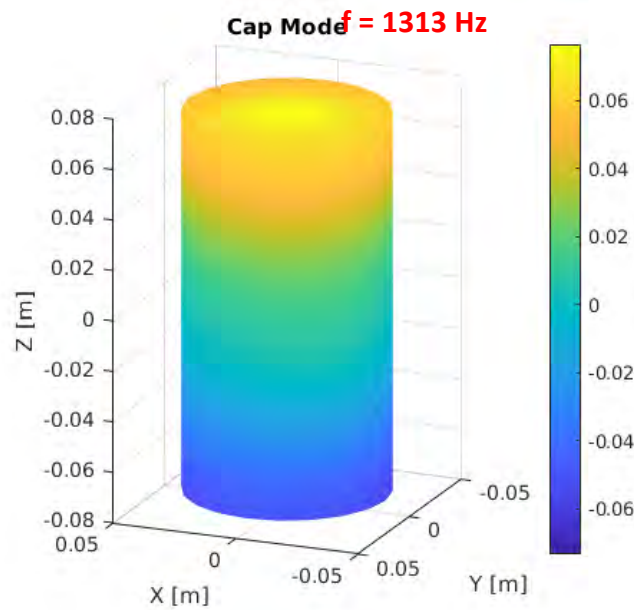
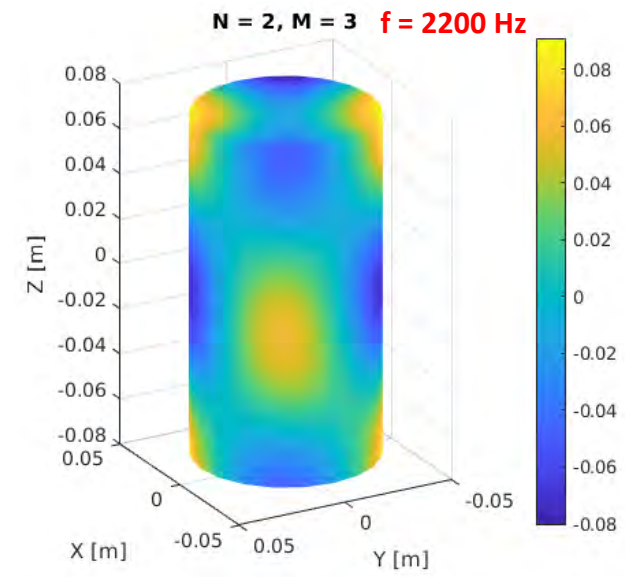
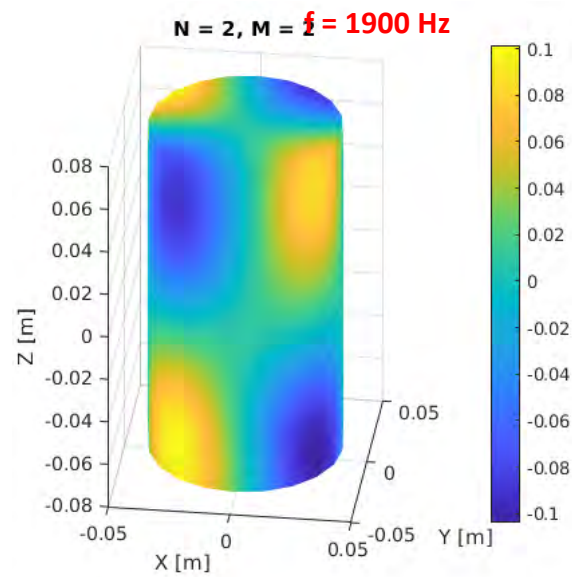
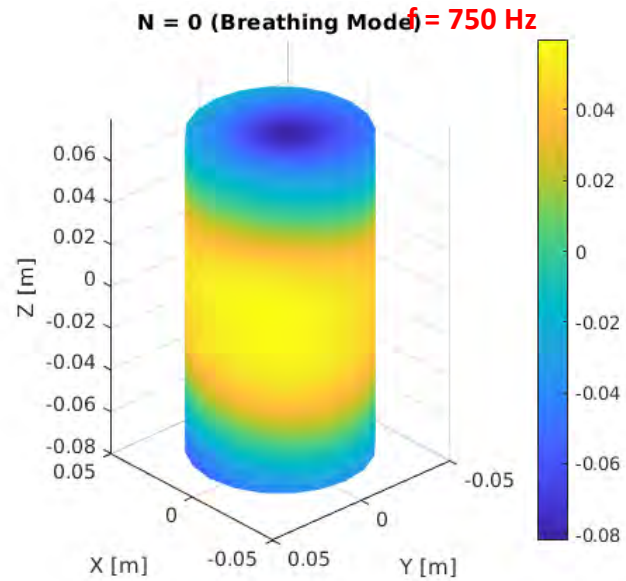


**f = 700 Hz**

EXPERIMENTAL DATA



# Additional Eigenmodes reconstructed from Experiments



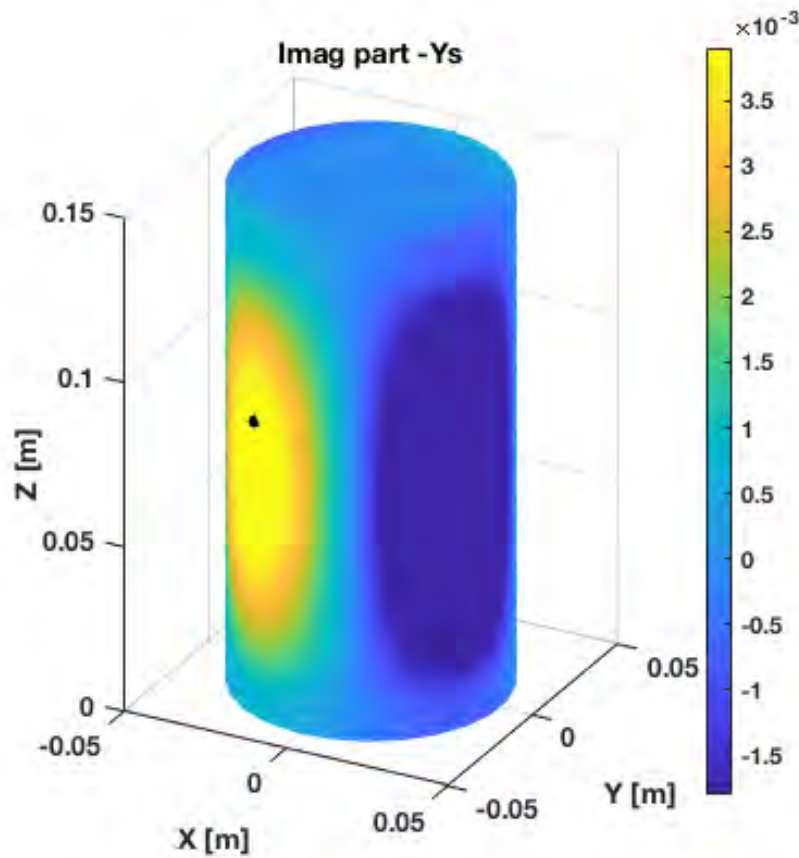


# Structural Admittance

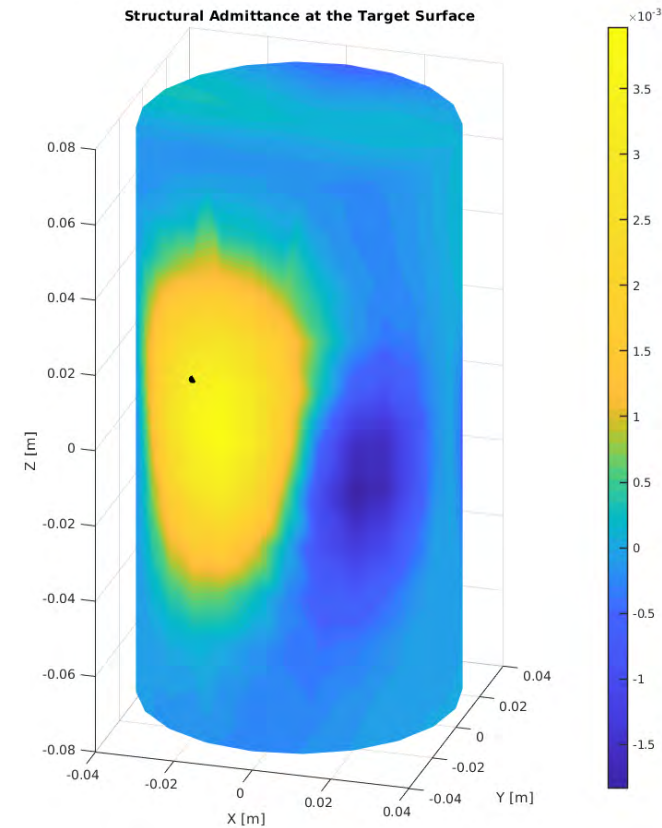
- Comparison of the structural admittance of the cylindrical target at 950 Hz for simulated and experimental data (black dot = excitation point) using the first 20 singular values

$$Y_S = \langle vp^* \rangle \langle pp^* \rangle^{-1}$$

COMSOL SIMULATION



EXPERIMENTAL DATA



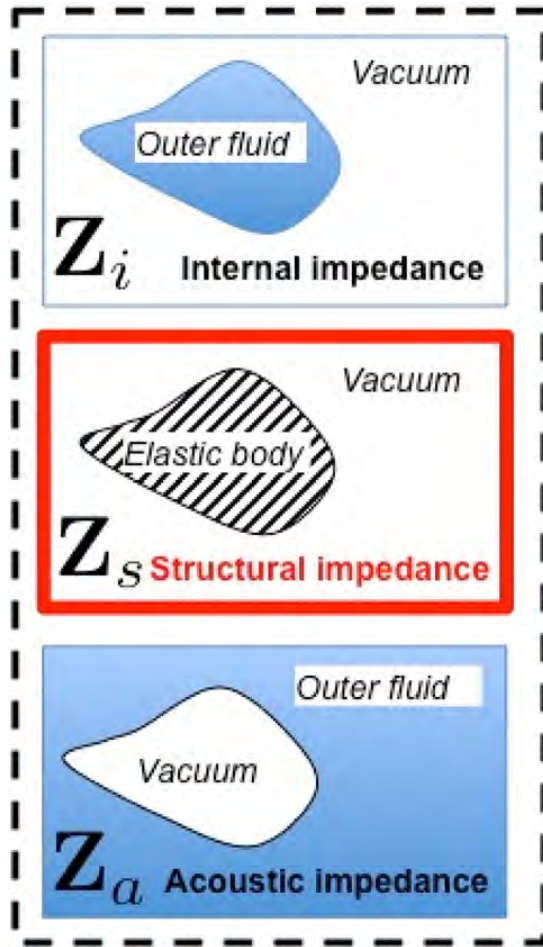
# WHERE WE ARE GOING:

## SCATTERING FROM "LOADED" TARGET: INCLUDE EXTERNAL MEDIUM

Simple manipulation of the impedances yields<sup>1</sup>,

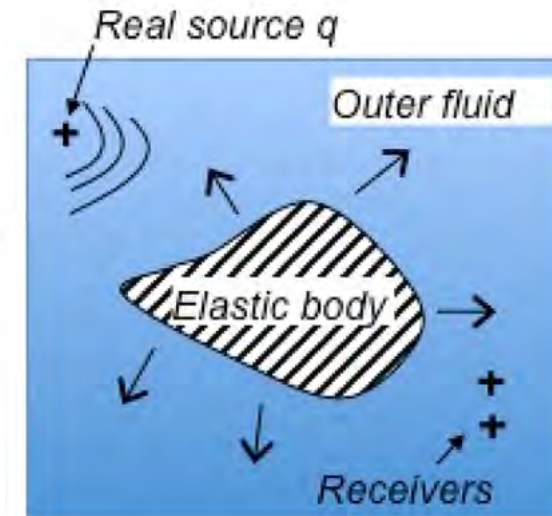
where  $\mathbf{p}_s$  is the scattered field on the surface:

$$\mathbf{p}_s = \underbrace{\left( \frac{1}{\mathbf{Z}_a} + \frac{1}{\mathbf{Z}_s} \right)^{-1}}_{\mathbf{S}=\text{Scattering Matrix}} \left( \frac{1}{\mathbf{Z}_i} - \frac{1}{\mathbf{Z}_s} \right) \mathbf{p}_i$$



$\mathbf{Z}_s$  contains the physics of the elastic body when placed in a vacuum

NOTE:  $\mathbf{Y}=\mathbf{Z}^{-1}$



Scattered field at the receivers

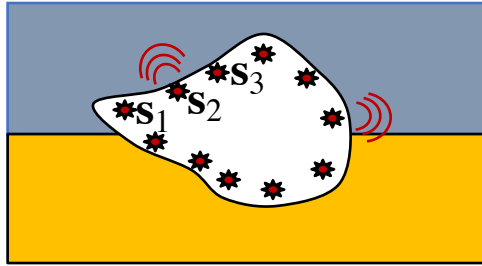
<sup>1</sup>Bobrovntiskii (2006), *A new impedance-based approach to analysis and control of sound scattering*

Borgiotti (1990); Gaumont et Yoder (1995); Lucifredi and Schmidt (2004); Bobrovntskii (2006)







# “Insertion” into the medium

## Example: a partially buried mine

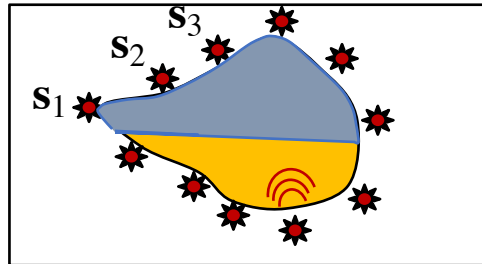


$$\mathbf{Z}_a = \mathcal{G}\mathcal{G}_v^{-1}$$

$$\mathbf{p}_s = \mathcal{G}\mathbf{s}$$

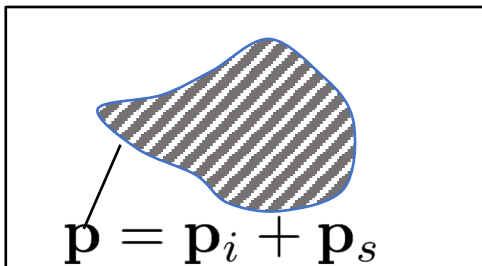
key  
 in vacuo region   
 sand   
 water   
 mine 

Any propagation code (e.g. RAM by Collins) that accommodates point sources in layered media can be used to provide the medium Green functions,



$$\mathbf{Z}_i = \mathcal{G}_i\mathcal{G}_{iv}^{-1}$$

$$\mathcal{G}, \mathcal{G}_v, \mathcal{G}_i, \mathcal{G}_{iv}$$



$$\mathbf{Z}_s$$



$$\mathbf{p}_s = \underbrace{\left( \frac{1}{\mathbf{Z}_a} + \frac{1}{\mathbf{Z}_s} \right)^{-1} \left( \frac{1}{\mathbf{Z}_i} - \frac{1}{\mathbf{Z}_s} \right)}_{\mathbf{S}=\text{Scattering Matrix}} \mathbf{p}_i$$

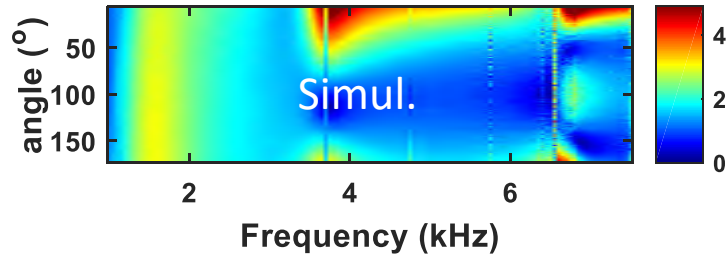
# Simulated Experiment: Target Echo Strength in Water

$$\mathbf{p}_s = \mathbf{S} \mathbf{p}_i$$

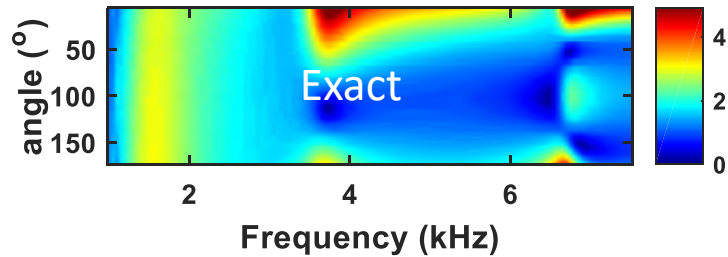
$$\mathbf{p}_{sff} = \mathbf{H} \mathbf{p}_s$$

- Two 250 mike arrays (separated by 5 mm)
- Two 600 point equivalent sources arrays
- 300 incident plane waves (isotropic)
- SNR  $\sim$  44dB (traveling wave noise)

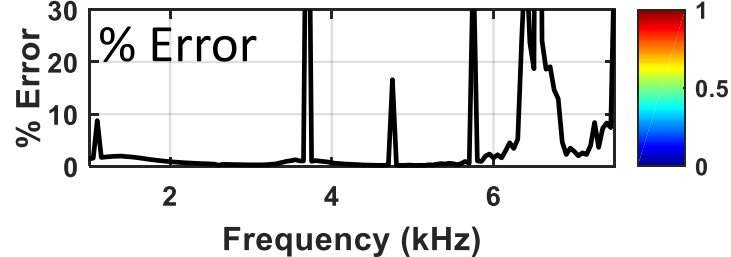
$|\mathbf{p}_s|$  in farfield, Exper, da=0.005



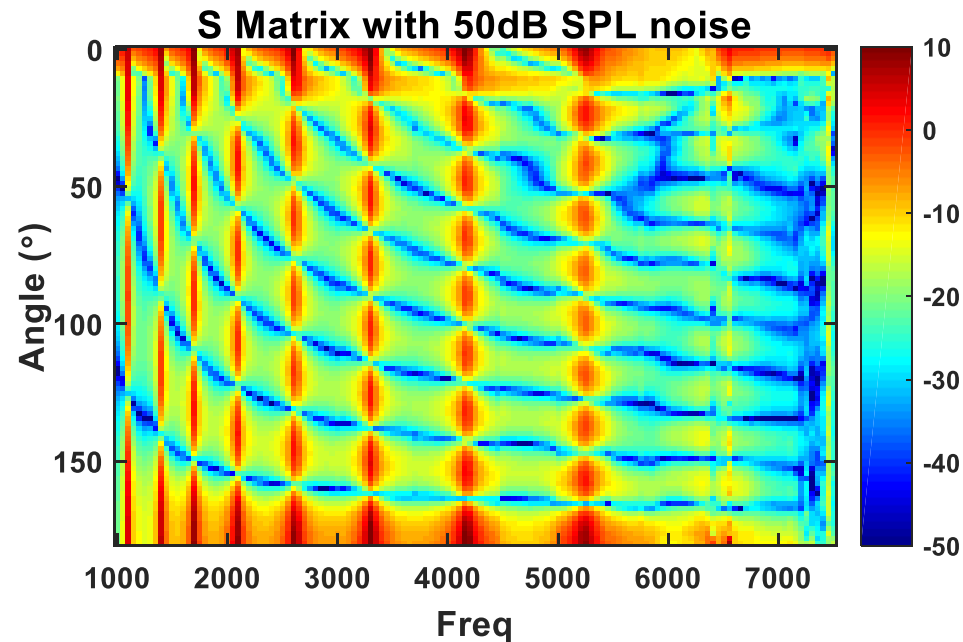
$|\mathbf{p}_s|$  in farfield, Exact, drh=0.002



Noise SPL=50dB



$$\mathbf{S} = (\mathbf{Y}_a + \mathbf{Y}_s)^{-1} (\mathbf{Y}_i - \mathbf{Y}_s)$$



# Structural Acoustics

- INITIAL DEMO: EVEN WITH LIMITED NUMBER OF SENSORS, DETAILED STRUCTURAL PROPERTIES DETERMINED
- NOT SHOWN: LOCALIZATION OF DEFECTS\*
- NEXT:
  - REFINE ACCURACY
  - DETERMINE SCATTERED FIELD OF MEDIUM -“LOADED” TARGET AND CONFIRM
  - EXTEND MEASUREMENTS TO MORE COMPLEX OBJECT USING 500 SENSORS
  - STRUCTURAL TOMOGRAPHY

\*Lubeigt et al (JASA EL 2019), Metwally et al:Poster

# SUMMARY

- OCEAN IS A DYNAMIC COMPLEX MEDIUM; GOAL IS TO EXTEND PROCESSING TO COMPLEX, LOW SNR SCENARIOS.
  - SUFFICIENT *A PRIORI* MEDIUM KNOWLEDGE NOT POSSIBLE
  - USE THROUGH THE SENSOR DATA AND PHYSICS OF COMPLEX MEDIA
  - NOISE FOR TOMOGRAPHY AND ....
- STRUCTURAL ACOUSTICS: STRUCTURE IS COMPLETELY DESCRIBED BY ITS SURFACE IMPEDANCE,  $Z$  (or ADMITTANCE,  $Y$ )
  - NOISE (AND HOLOGRAPHY) CAN PROVIDE  $Z$
  - NOISE CAN PROBE FOR STRUCTURAL DEFECTS (SHM)