### ACOUSTICAL METHODS FOR THE MONITORING OF THE MARINE ENVIRONMENT

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### The geometry at a vertical slice



*By representation theorem the acoustic pressure can be expanded in terms of the eigenfunctions of the Depth Problem* 

$$p(r,z;\omega) = \sum_{n=1}^{N} A_n(r;\omega) u_n(z;\omega)$$

$$p(r,z;\omega) = \frac{i}{4\rho_1} \sum_{n=1}^N H_0^{(1)}(\kappa_n r) u_n(z_0;\omega) u_n(z;\omega)$$

**Broad-band propagation** 

 $p'(r, z, \omega) = p(r, z; \omega)S(\omega)$ 

The pressure in the time domain

 $p(r,z;t) = \mathfrak{T}^{-1}[p'(r,z,\omega);\omega \to t]$ 



### Each mode propagates at a different group velocity

 $\partial \omega$ 





 $v_{gn} = \frac{\partial \omega}{\partial \kappa_n}\Big|_{\omega_0}$ 

 $\tau_n = \frac{\partial \overline{\kappa}_n}{\partial \omega} \bigg|_{\omega_0}$ 

# Methods of Ocean Acoustic Tomography

# Linear methods

# Ray Inversions Linearizing with respect to a reference environment

$$c(\vec{x}) = c_0(\vec{x}) + \delta c(\vec{x})$$

$$\delta \tau_n = \int_{\Gamma_n} \frac{\delta c(\vec{x})}{c_0^2(\vec{x})} ds$$

$$d_n = \int_{\Gamma_n} \frac{v(\vec{x})}{c_0^2(\vec{x})} ds$$

### **Ray Inversions**

$$c(\vec{x}) = c_0(\vec{x}) + \delta c(\vec{x})$$

$$\delta \tau_n = \int_{\Gamma_n} \frac{\delta c(\vec{x})}{c_0^2(\vec{x})} ds$$

### Model ? Determination of the eigen-ray path $\Gamma_n$

 $d_{i}$ 

Parameters ?  $\delta c(\vec{x})$ 

Measurements ?

 $\delta \tau_n$ 

Definition of an inverse problem of the form:

 $d_i = \int G_i(\vec{x}) m(\vec{x}) d\vec{x}$ 

### We need the theory to predict $G_i(\vec{x})$

After suitable discretization

$$d_i = \sum_{j=1}^N G_{ij} m_j$$

**Discrete Linear Inverse Problem** 



#### **Using Empirical Orthogonal Functions**

 $\delta c(z) = \sum_{\ell} \theta_{\ell} f_{\ell}(z)$ 





Additional a-priori information !

### **Necessary Assumption :**

### Ray arrivals can be resolved and identified !

### If not

### Check for modal arrivals !!

# Modal Travel-Time Inversions If modal arrivals can be resolved and identified !!

Modal packets travel with their respective group velocity



 $\partial \omega$ 

Vgn

Linearizing with respect to a reference environment we get an expression of the travel time differences in terms of sound speed differences

$$\tau_{n} = \frac{\partial \overline{\kappa}_{n}}{\partial \omega} \bigg|_{\omega_{0}} r \qquad \qquad \delta \tau_{n}(r) = \frac{\partial \delta \overline{\kappa}_{n} r}{\partial \omega} \bigg|_{\omega_{0}}$$

From theory and assuming low order perturbations

$$\delta \overline{\kappa}_n = \frac{1}{\kappa_n^0} \int_D \frac{1}{\rho(\overline{x})} \left| u_n^0(\overline{x}) \right|^2 \frac{k^{02} \delta c(\overline{x})}{c_0(\overline{x})} d\overline{x}$$

By suitable discretization or expression of the sound speed difference in terms of EOFs we define a linear system of the form

$$\delta \tau_n(r) = \frac{\partial \delta \overline{\kappa}_n r}{\partial \omega} \bigg|_{\omega_0} = \sum_{i=1}^{I} \sum_{j=1}^{J} \left( \frac{\partial Q_{n,i,j}^0}{\partial \omega} \bigg|_{\omega_0} \right) \delta c_{i,j} \Delta z \Delta r$$

 $d_n \to \delta \tau_n$ 

*n*=1,....*N* 

 $d_n = \sum_{k=1}^M G_{nk} m_k$ 

N: number of identifiable modal arrivals





Advantages of linear methods :
Easy to implement
Computationally efficient and fast

**Disadvantages of linear methods :** 

- Require good a-priori knowledge of the environment
- The kernel matrix sometimes is characterized by bad condition

# Non linear methods

### Measurements (Data)

We need to define the "observables"
They have to be easily measured or inferred after some post-processing of the measured data.
They should be sensible to changes of the environmental parameters.

### Measurements (Data)

- Measurements are always the acoustic field either at a single hydrophone or on an array of hydrophones.
- The data to be used in the inverse problem can be

### Measurements (Data)

- The field at a specific frequency or at a frequency band (acoustic pressure)
- The ray or modal arrivals (time of arrival)
- The dispersion curves (characteristic of modal propagation)
- The modal "phase" for each one of the propagating modes
- Statistical or probabilistic features of the signal

### **Matched Field Inversions**

If a vertical array of hydrophones is available, the full-field can be used for inversions

### Matching at a single frequency : Perform Discrete Fourier Transform to obtain the field in the frequency domain at each one of the *N* hydrophones

$$F_{n}(\vec{x};\omega) = \sum_{k=0}^{K} p_{n}(\vec{x};t_{k}) w(t_{k}) e^{-i\omega t_{k}}$$

- Collect measurements of the acoustic field in N  $\geq 1$  hydrophones
- Select a propagation model and use it to compute the acoustic field for candidate model parameters
- Use a suitable processor to cross-correlate the measured with modelled/predicted replica fields and search for the *highest* correlation

### **Optimization Process !!**

## Measured in *N* hydrophones

## Modeled for *N* hydrophones

 $\hat{\mathbf{F}} = (\overline{\hat{F}_1, \hat{F}_2, \dots, \hat{F}_N})^T$ 

$$\mathbf{F} = (F_1, F_2, \dots, F_N)^T$$

 $C = \langle \mathbf{F}\mathbf{F}^+ \rangle$ 

Compare



 $L(\mathbf{m}) = \mathbf{w}^+ C \mathbf{w}$ 

#### Bartlett processor

**m**<sup>est</sup> will be the vector maximizing the Processor

For normalized data, maximum of the L(m) is 1

### **Inversions based on travel time**

Necessary Condition : Identification of the type of signal peaks:



Not always easy !

### **Inversions based on modal travel time**

Hypothesis : Identification of N modal arrivals

Replica fields are produced based on the prespecified search space of the model parameters.

Use of the group velocities calculated for the modes of the replica fields to identify the modeled arrivals of the propagating modes ,

Define the actual modal arrivals  $t_n$  and compare the corresponding times with the arrival times of the replica signals.  $\hat{t}_n, n=1,...N$ 

 $\delta t_n = t_n - \hat{t}_n$ 

The inverse problem is formulated as an implicit non-linear problem

 $\delta t_n = g(\mathbf{m})$ 

Define an appropriate processor *P* to solve the inverse problem as an optimization process

$$P(\delta t_n) = \sqrt{\frac{1}{N} \sum_{n=1}^{N} \delta t_n^2}$$

#### Test case



A description of the test environment based on the benchmark case WAa of the Vancouver 97 Workshop

### Arrival pattern (f $_0 = 112$ Hz)



## The cost function over the whole search space for the sediment properties



#### Inversion results

Parameter	Actual	Reference	Recovered
$C_{sed}(D)$	1516,2	1506,1	1517,44
$C_{sed}(D+h)$	1573,2	1539,5	1569,84

A systematic search over the search space has been performed

No specific optimization algorithms have been applied