



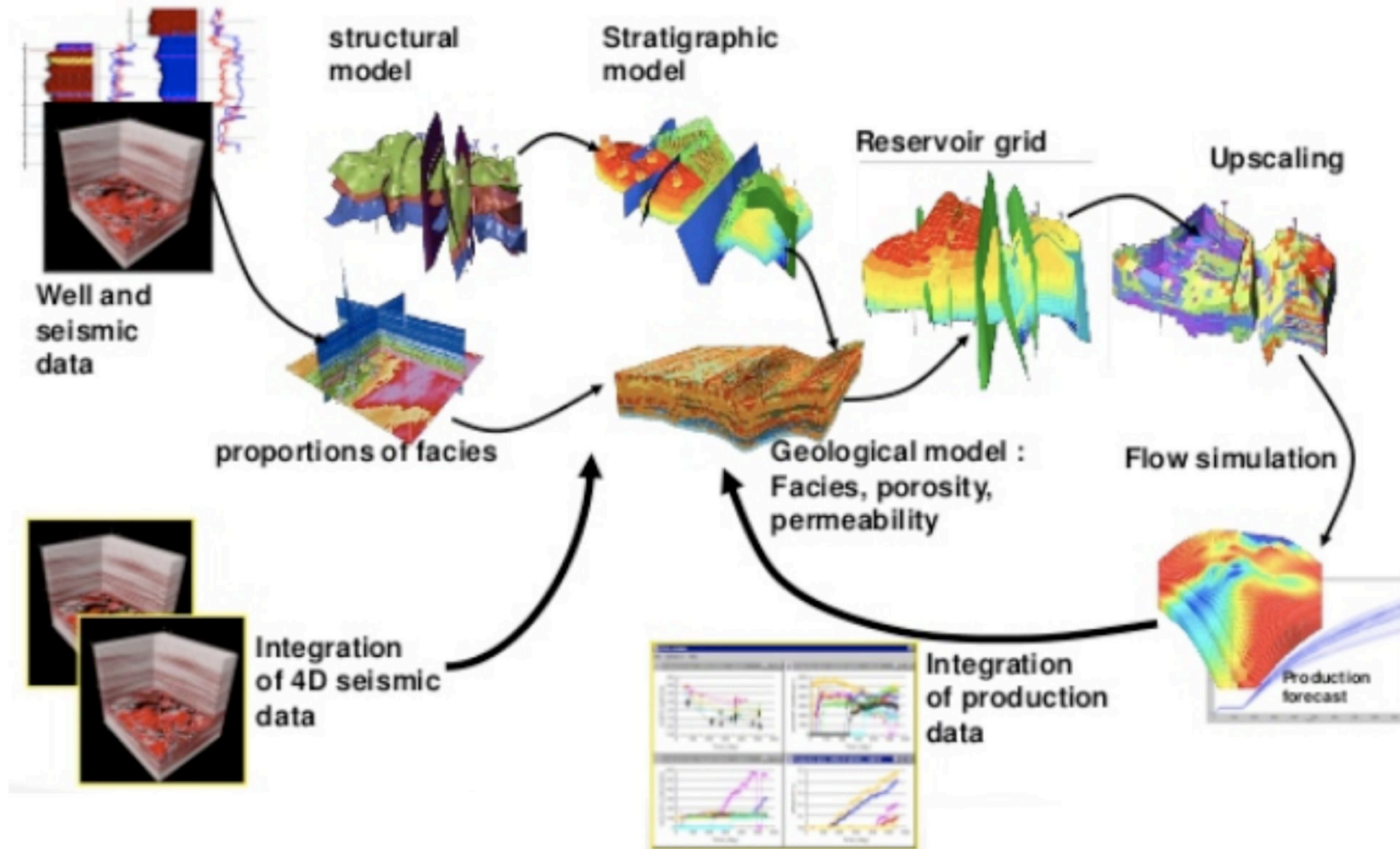
# Joint inversion of reflectivity and background subsurface components

Thesis defense

Alejandro Cabrales

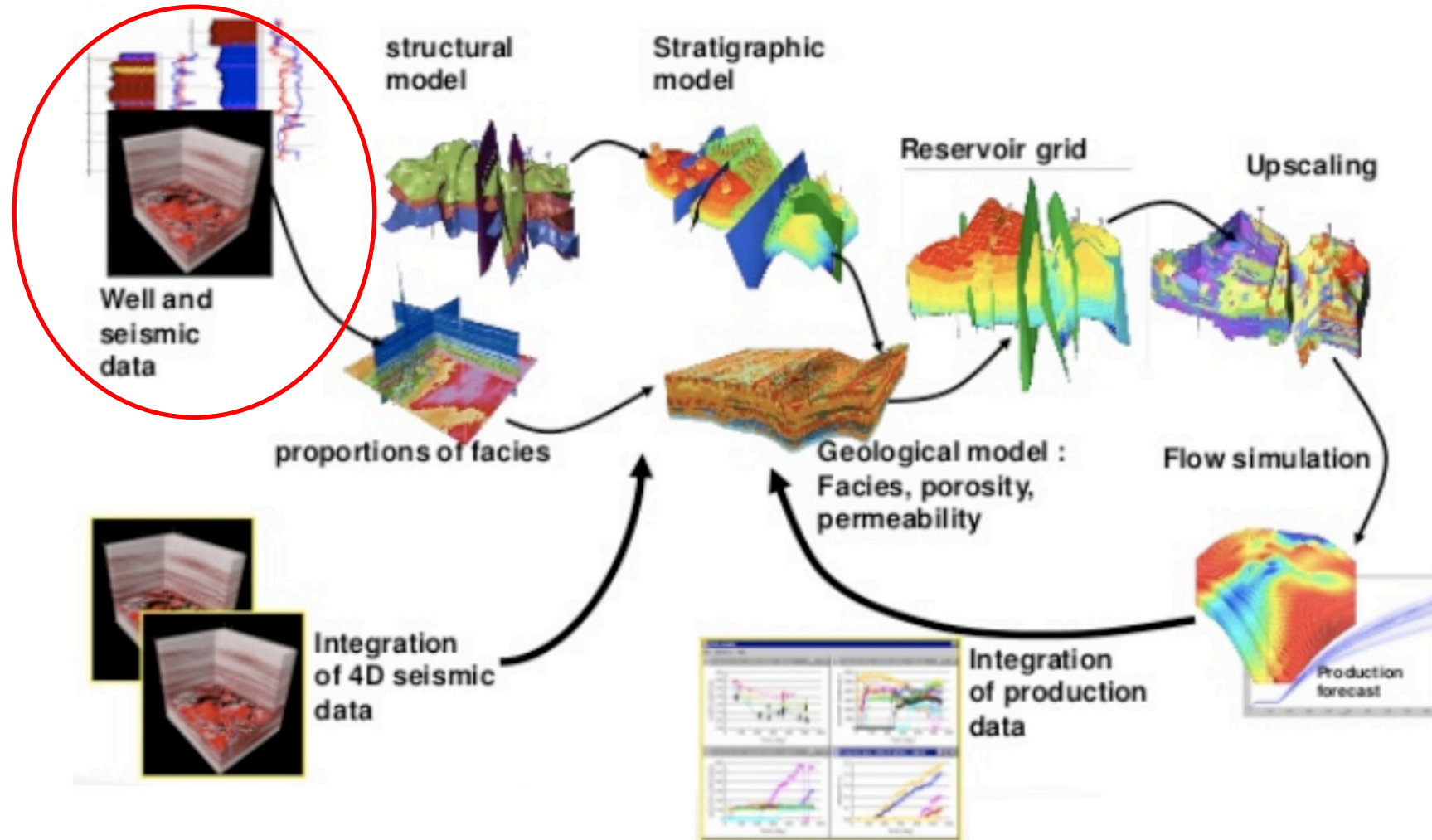
August 14, 2020

# INTRODUCTION





# INTRODUCTION



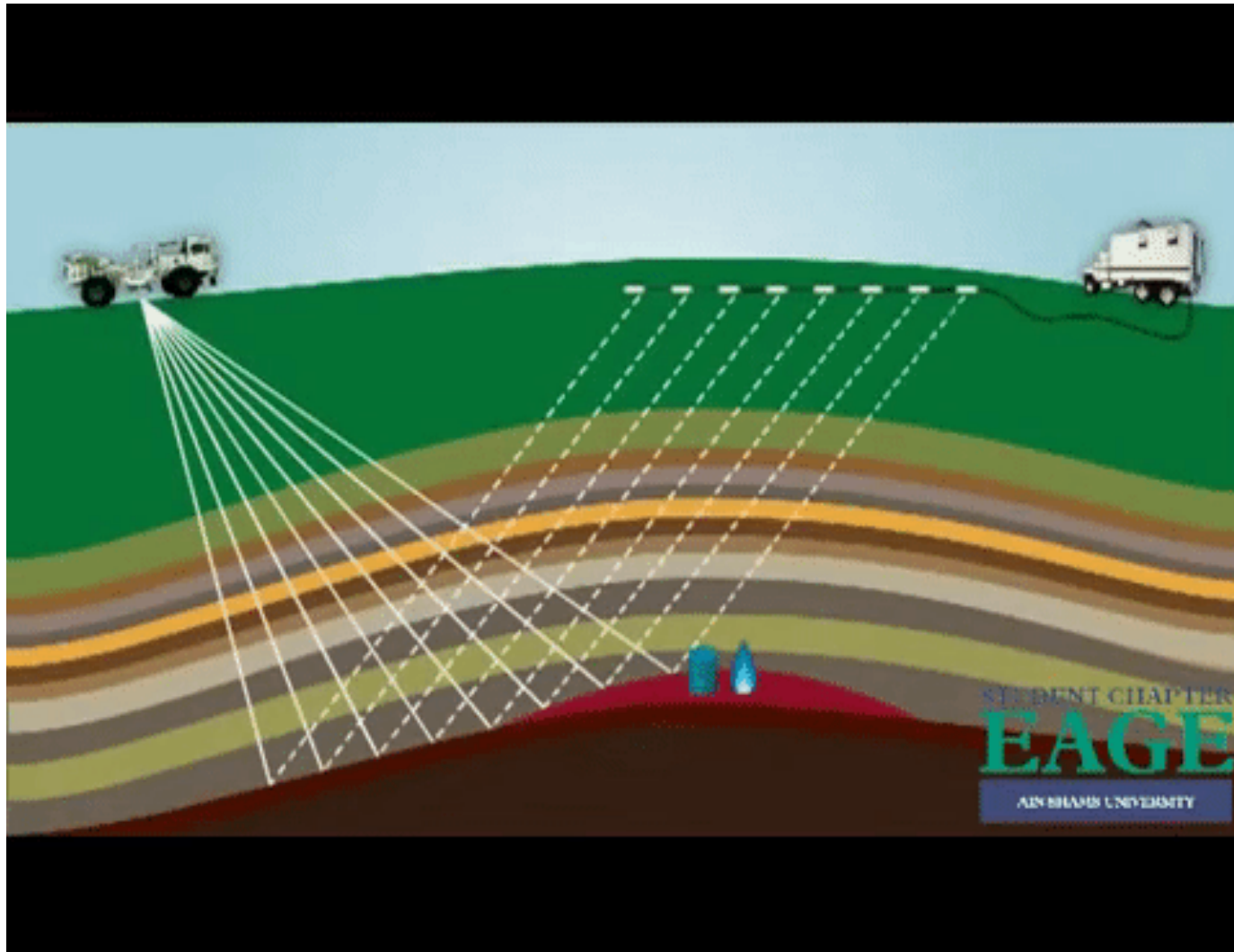


# INTRODUCTION

Main task in seismic imaging:  
Estimate acoustic/elastic subsurface parameters!

# INTRODUCTION

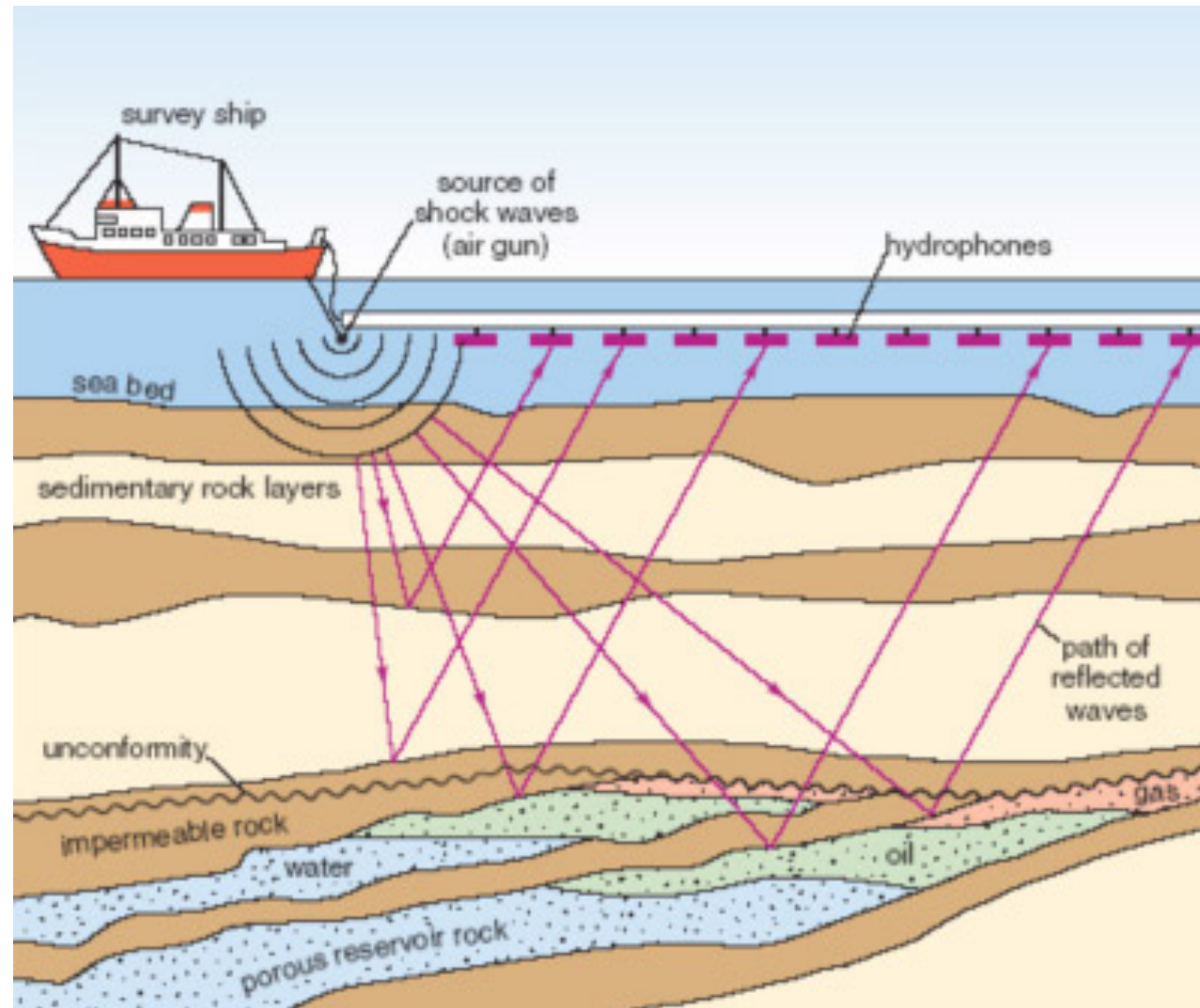
First, we need to acquire seismic data, onshore...





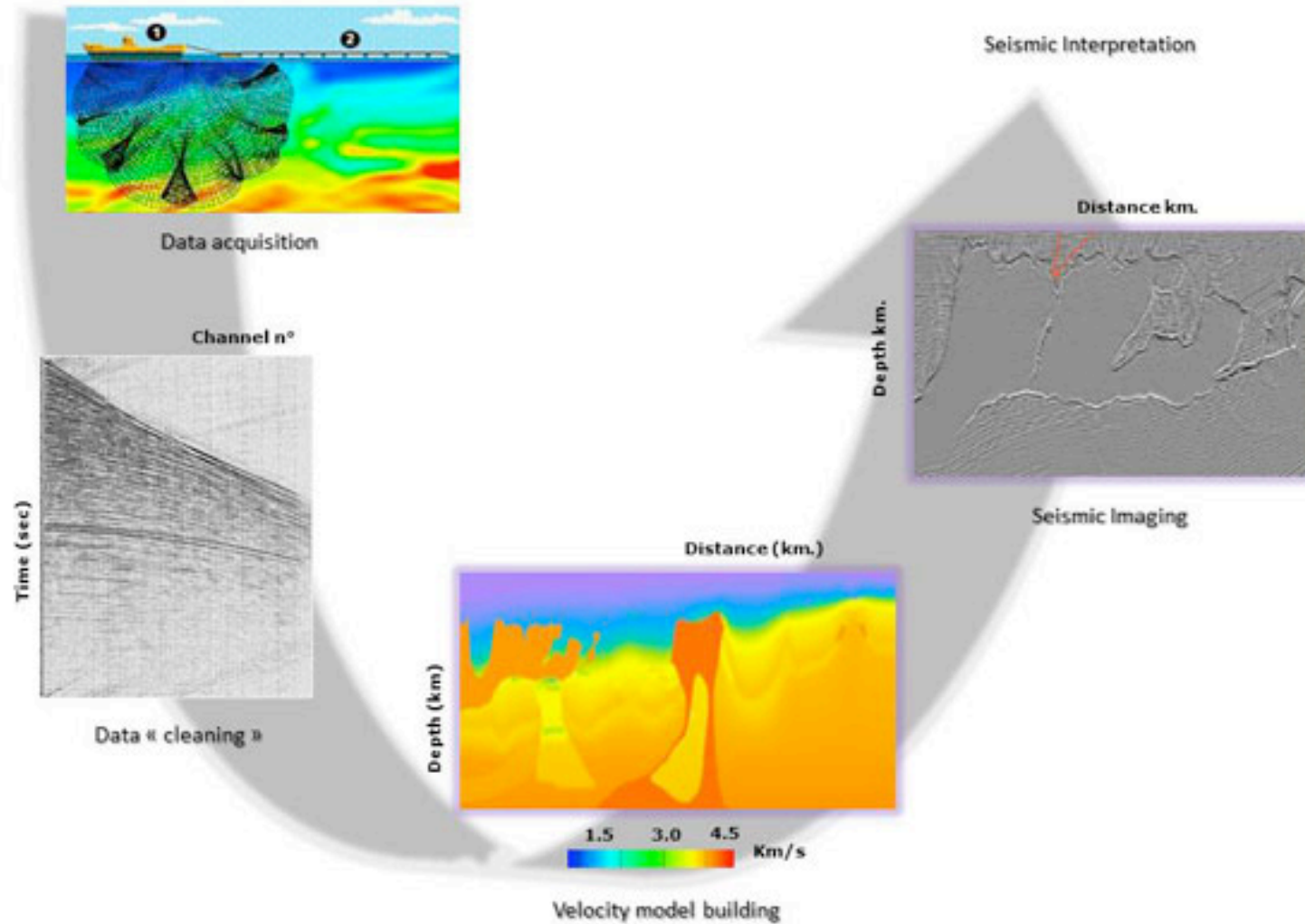
# INTRODUCTION

... or offshore!



# INTRODUCTION

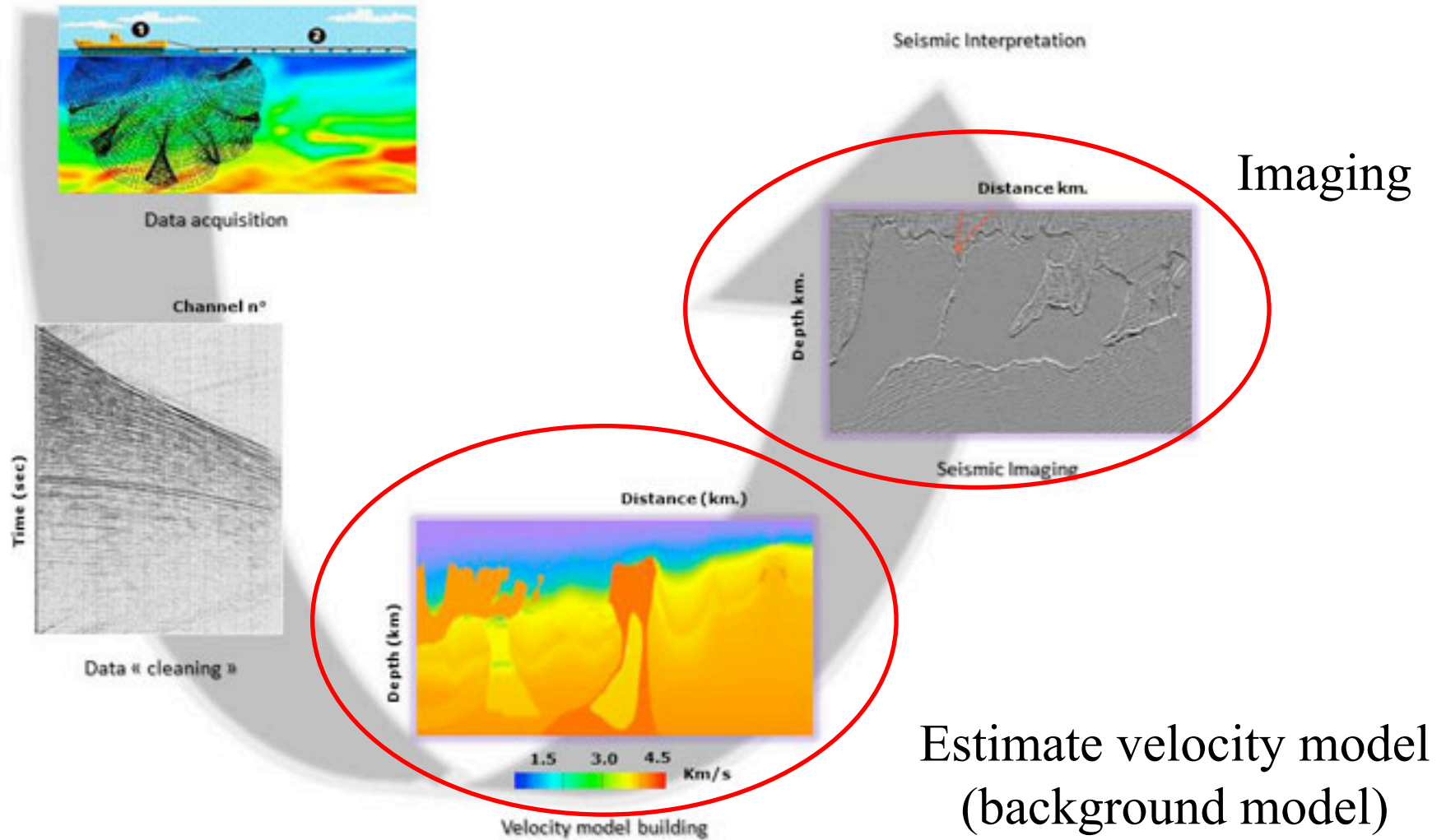
Next, we need to process the seismic data!



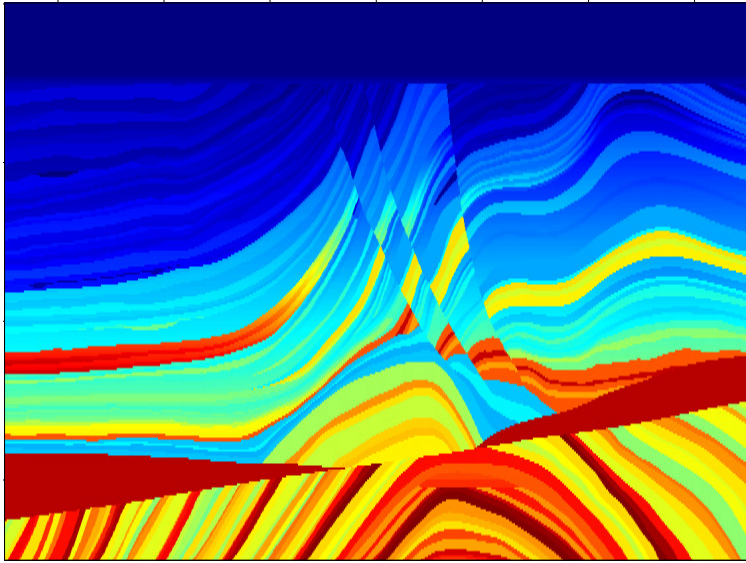


# INTRODUCTION

Next, we need to process the seismic data!



## Different scales of the subsurface parameters

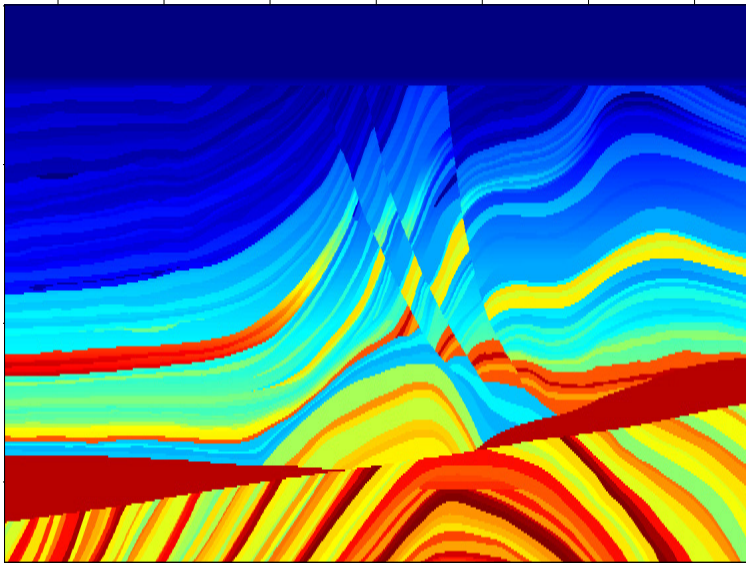


**m**

Subsurface model



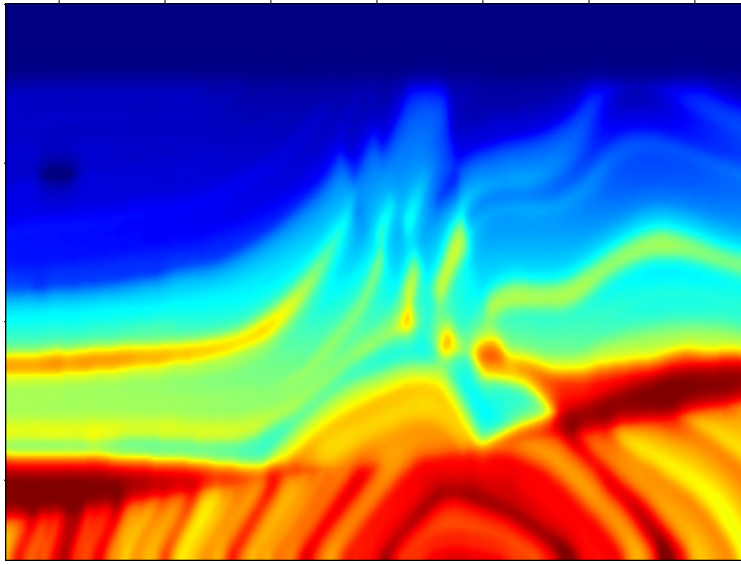
## Different scales of the subsurface parameters



**m**

Subsurface model

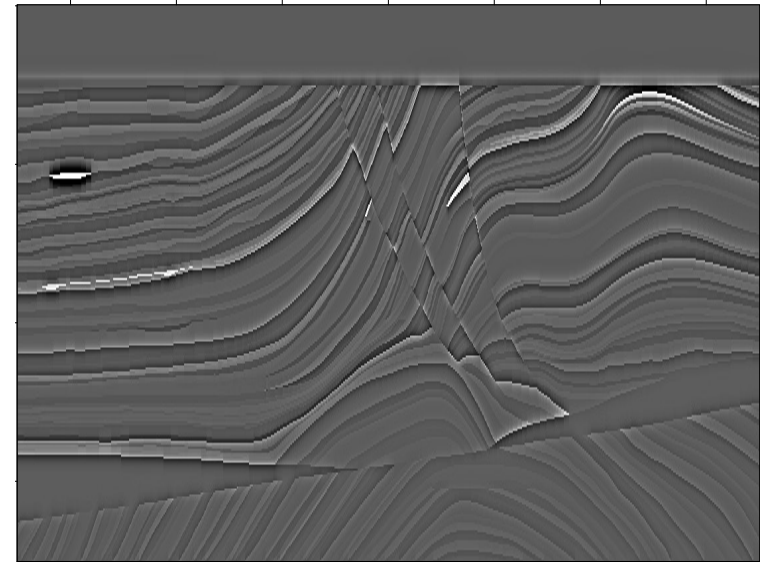
=



**b**

Background component of  
subsurface model (low-  
wavenumber component)

+

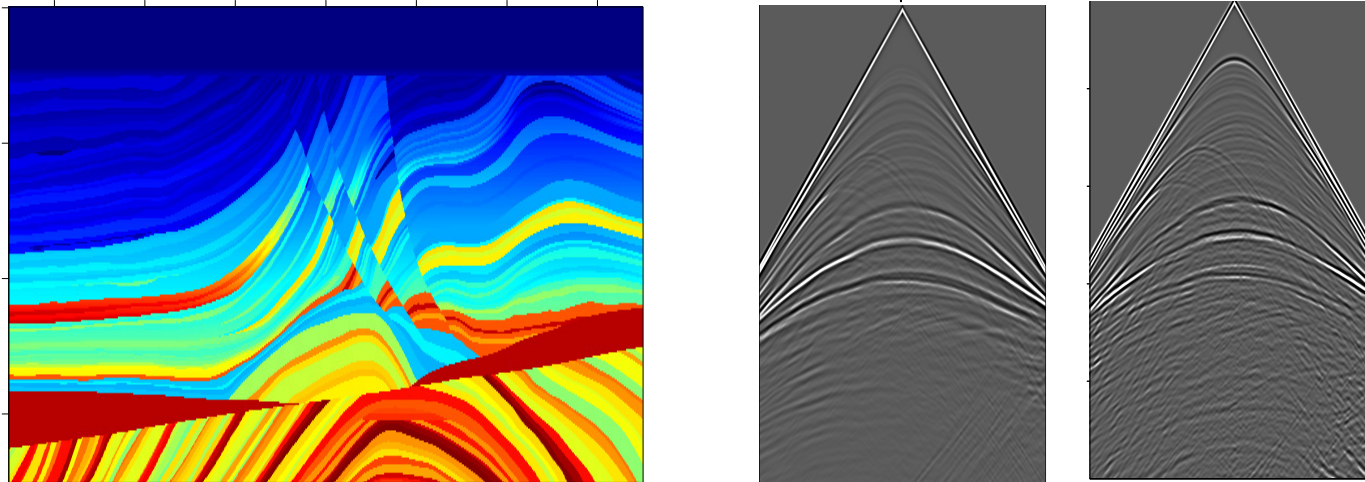


**r**

Reflectivity component of  
subsurface model (high-  
wavenumber component)

## Full waveform inversion (FWI)

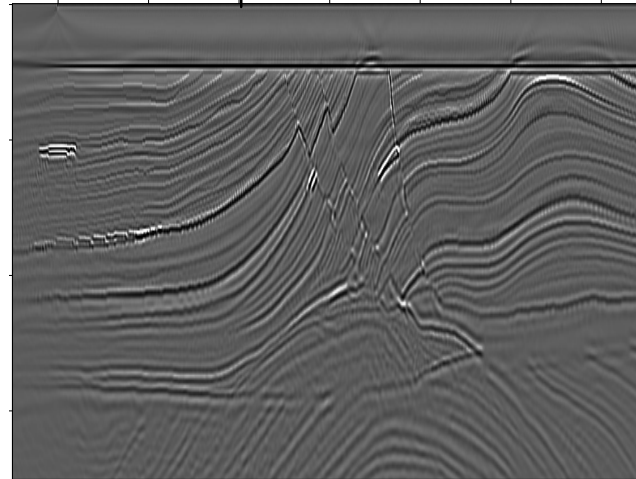
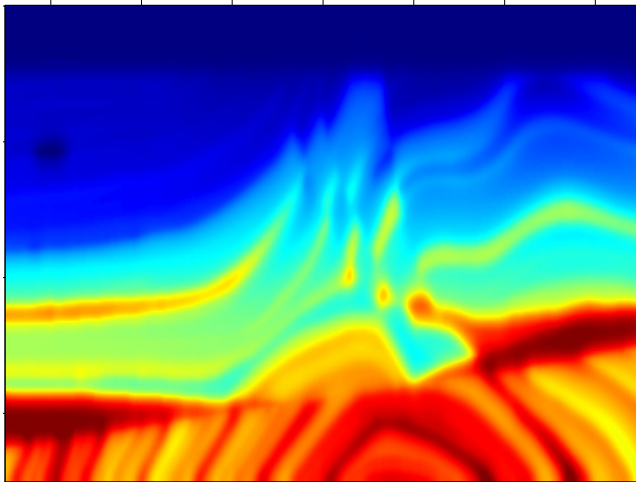
$$\Phi(\mathbf{m}) = \|\underbrace{\mathcal{L}(\mathbf{m})}_{\text{Predicted data}} - \underbrace{\mathbf{d}_{\text{obs}}}_{\text{Observed data}}\|_2^2$$



- Predict data with the acoustic/elastic wave equation
- Nonlinear; presence of local minima
- We obtain a high-wavenumber version of  $\mathbf{b}$ !

## Wave-equation migration velocity analysis (WEMVA)

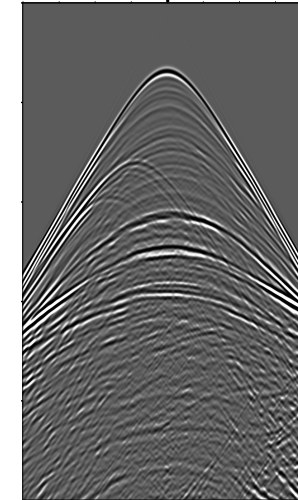
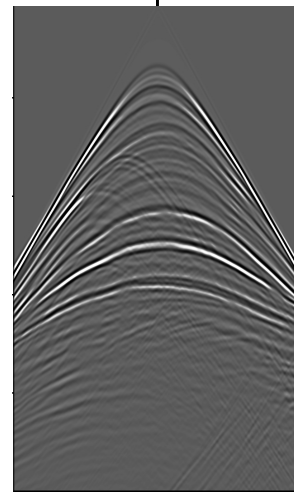
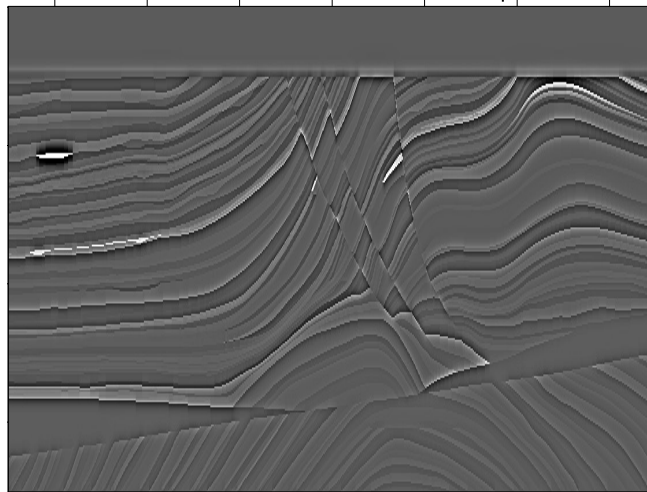
$$\Phi(\mathbf{b}) = -\underbrace{\|\mathbf{I}(\mathbf{b})\|_2^2}$$



- Generally good for imaging purposes!
- FWI should be better, but it'd more prone to fall into local minima
- A good idea could be used WEMVA model as input for FWI!

## Linearized waveform inversion (*data space*)

$$\Phi(\mathbf{r}) = \|\underbrace{\mathbf{L}(\mathbf{b})\mathbf{r}}_{\text{Model}} - \underbrace{\Delta\mathbf{d}}_{\text{Data}}\|_2^2$$



Conventional migration!



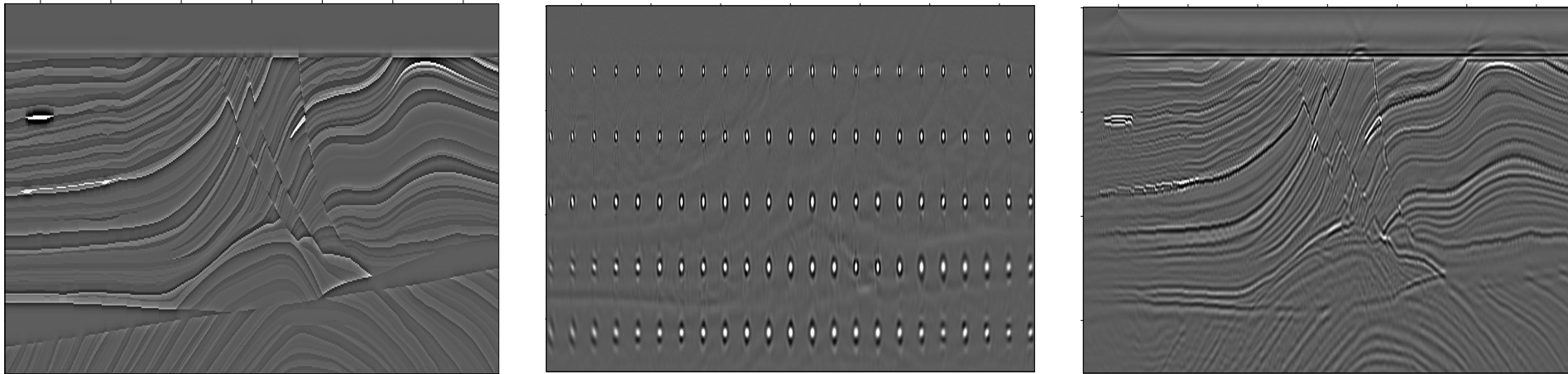
$$\mathbf{I}(\mathbf{b}) = \mathbf{L}(\mathbf{b})^T \Delta\mathbf{d}$$

- Also known as “Least-squares migration”
- Assumes accurate background subsurface model
- Effective, but requires lots of computations: 1 iteration costs  $\sim 2$  migrations



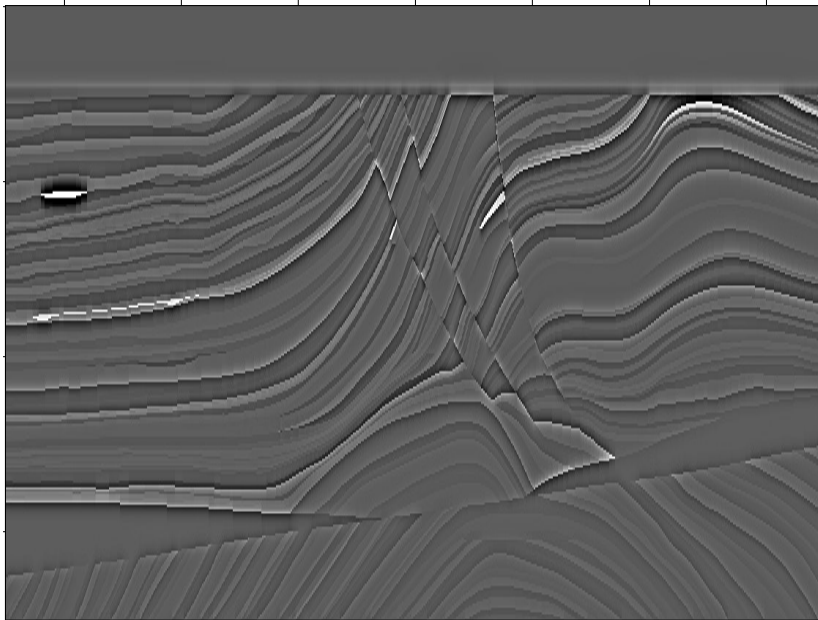
## Linearized waveform inversion (*image space*)

$$\Phi(\mathbf{r}) = \|\underbrace{\mathbf{H}(\mathbf{b})\mathbf{r}} - \underbrace{\mathbf{I}(\mathbf{b})}\|_2^2$$

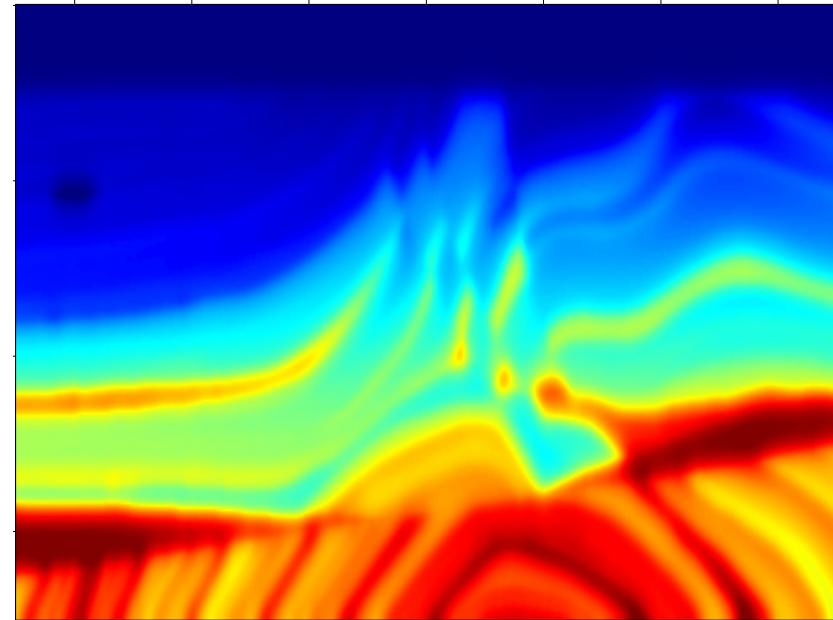


- The FWI's Gauss-Newton Hessian is defined as:  $\mathbf{H} = \mathbf{L}^T \mathbf{L}$
- It can be less precise than data-space LWI
- Once the Hessian is estimated, the inversion is fast (matrix-like multiplications)

Thesis proposal: Inverting for the reflectivity and background model simultaneously!

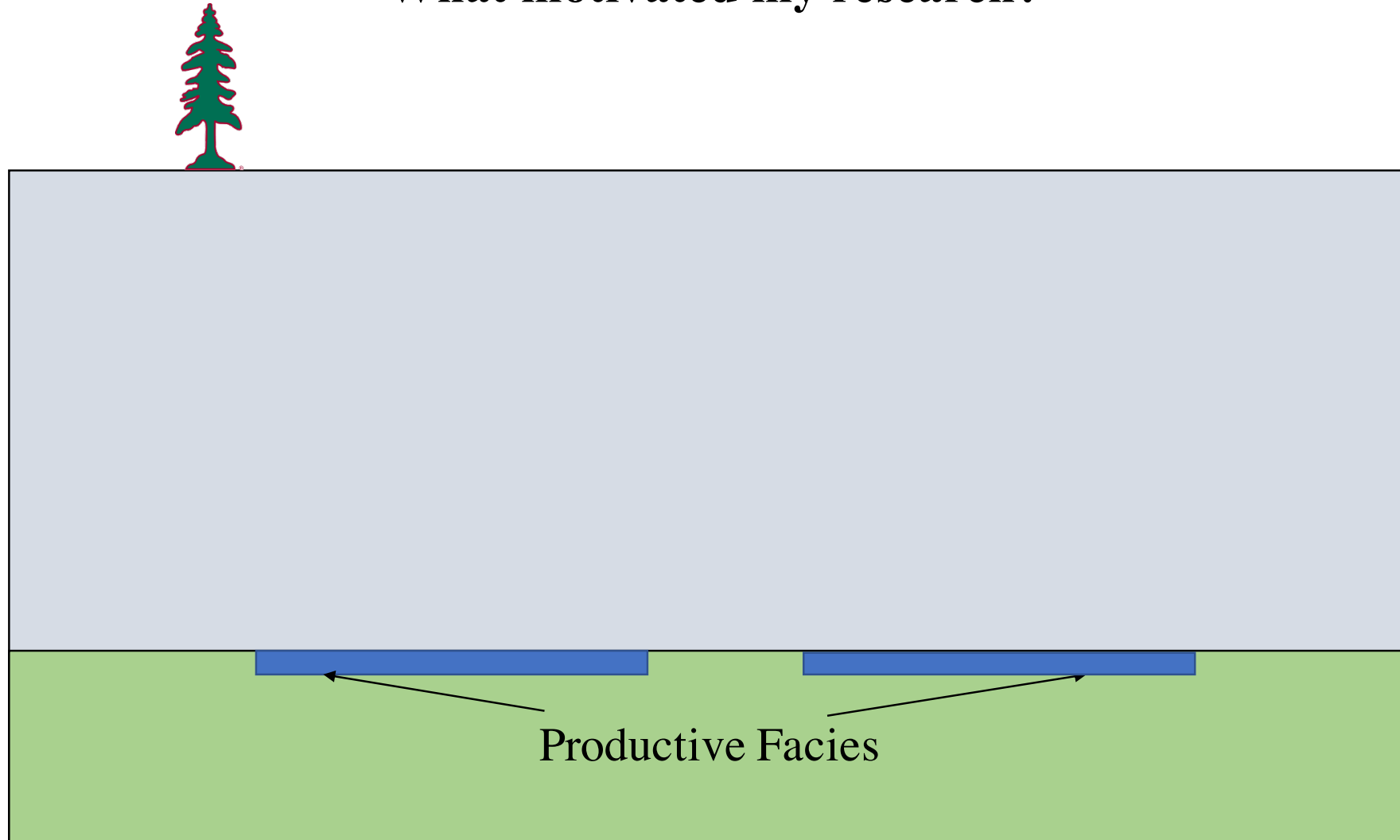


Reflectivity component of subsurface model



Background component of subsurface model

What motivated my research?

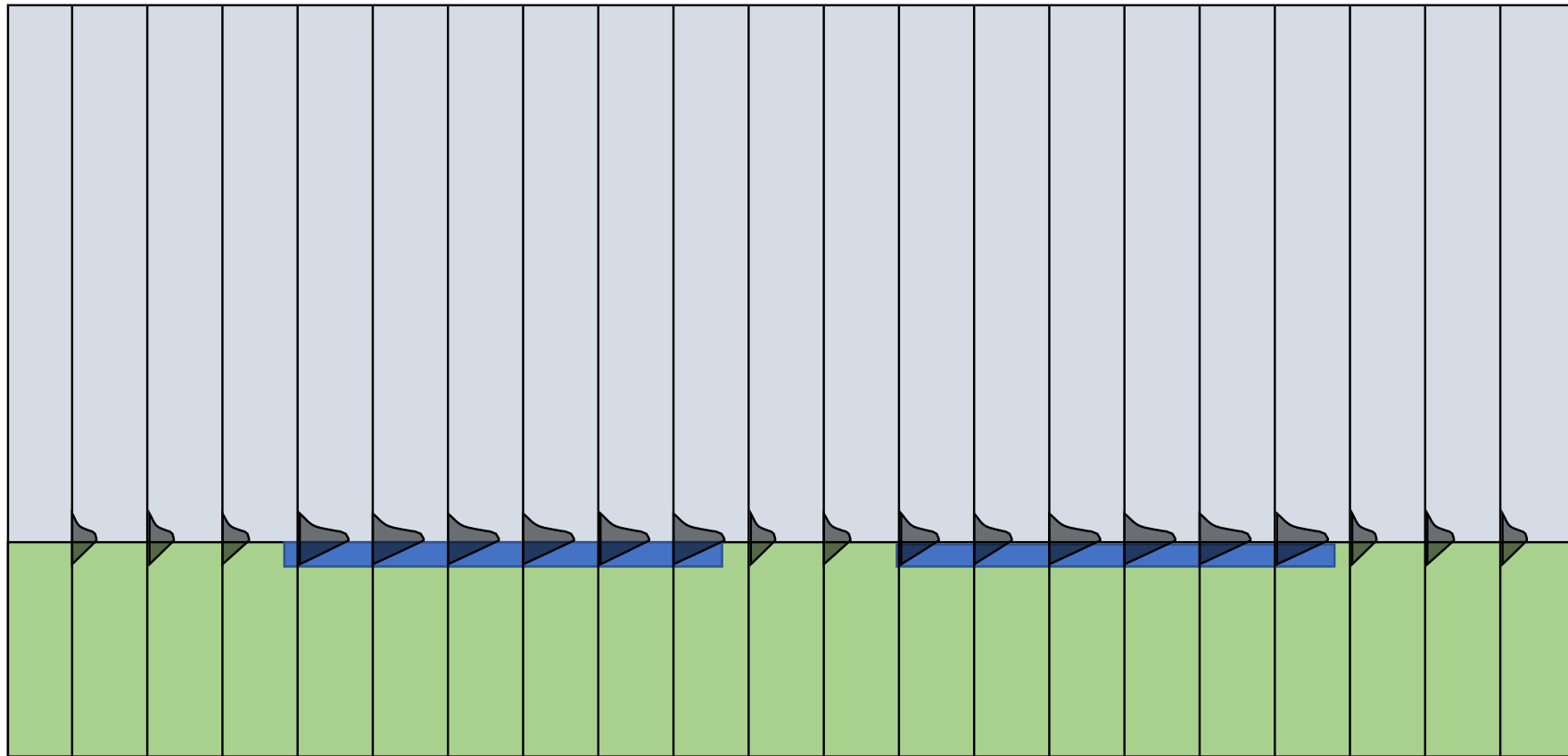
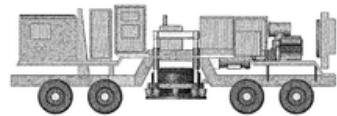






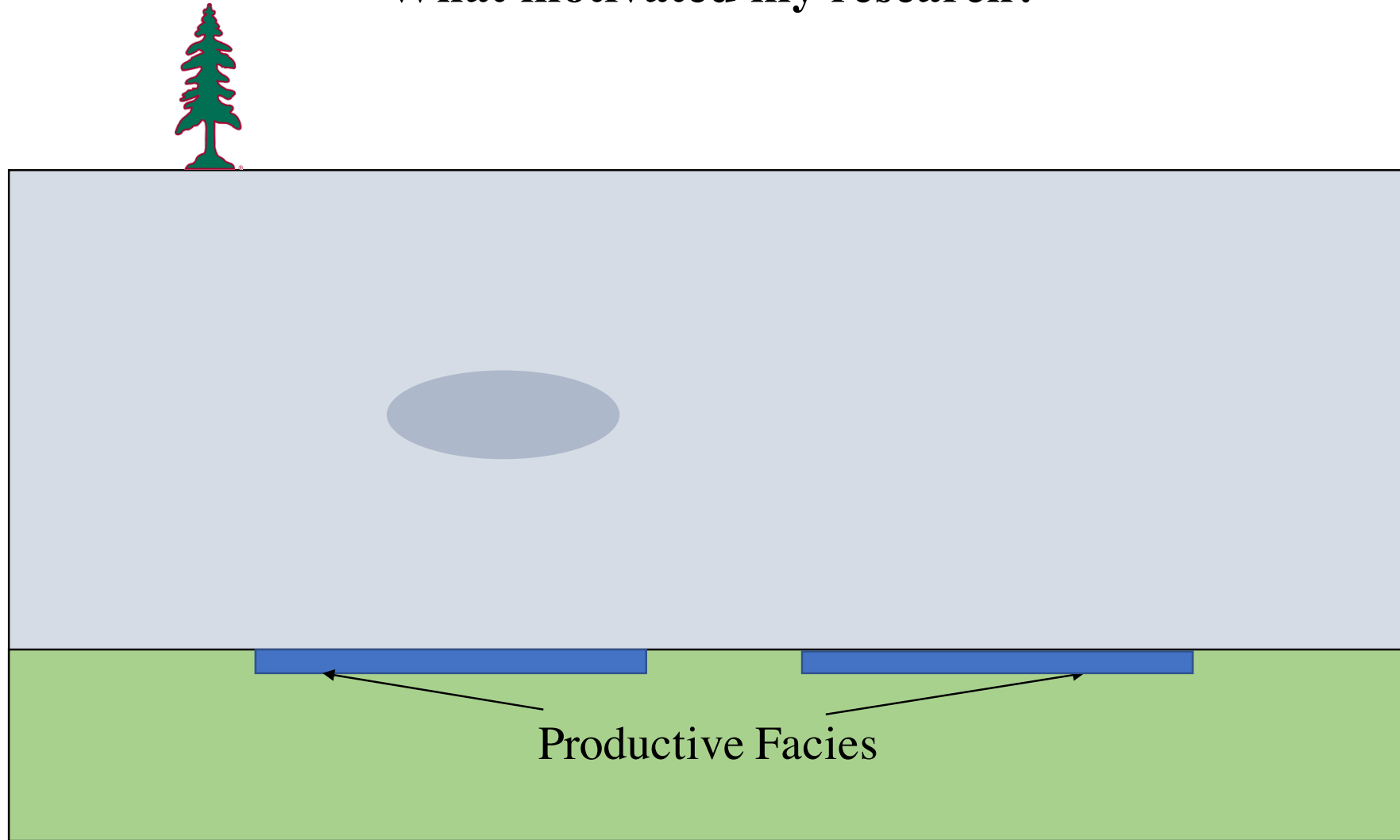
# INTRODUCTION

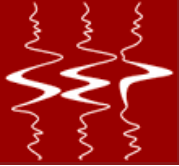
**What motivated my research?**



# INTRODUCTION

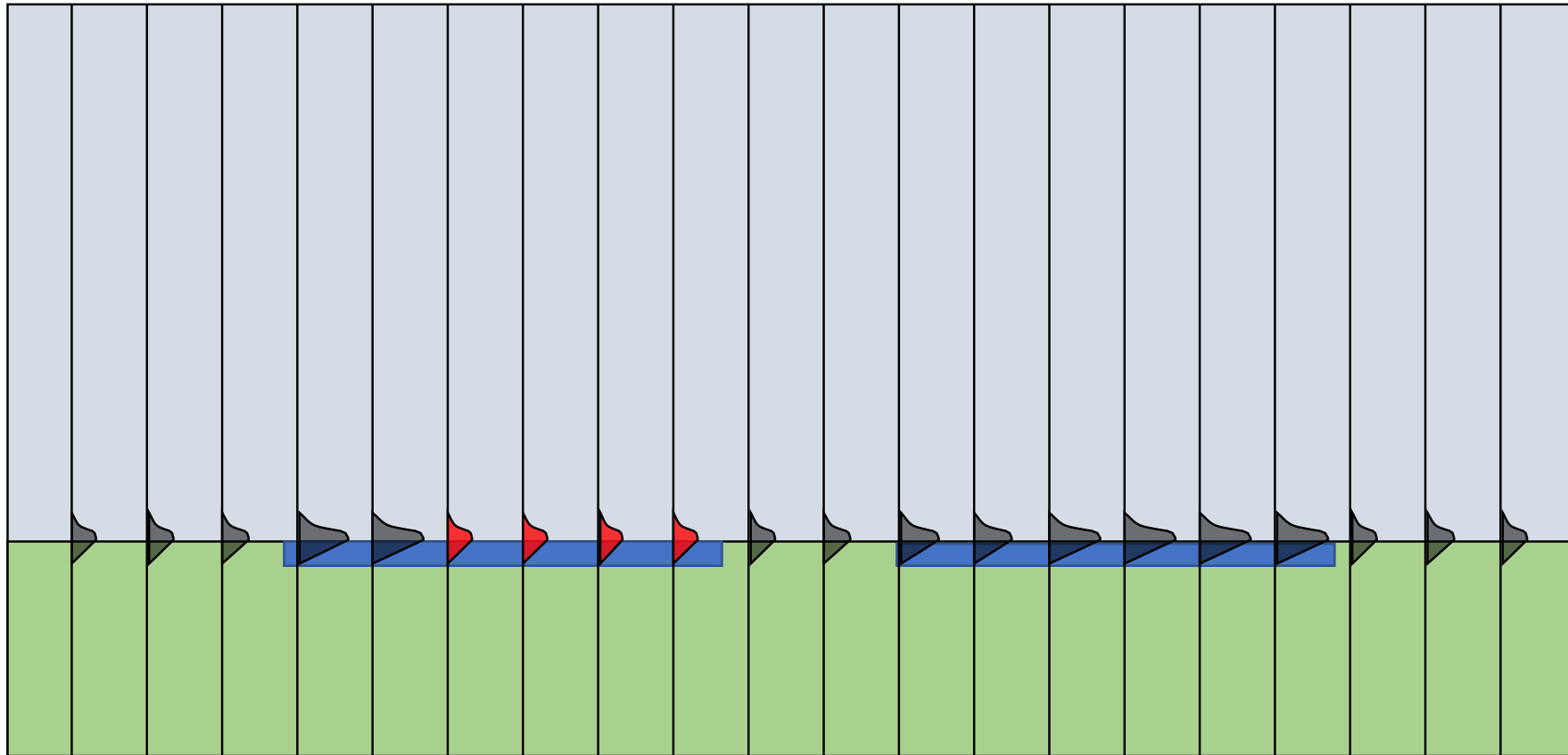
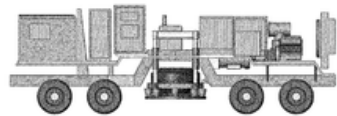
What motivated my research?





# INTRODUCTION

**What motivated my research?**



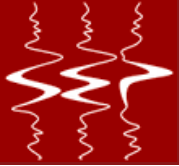


## Joint Inversion of Reflectivity and Background Components (JIRB)

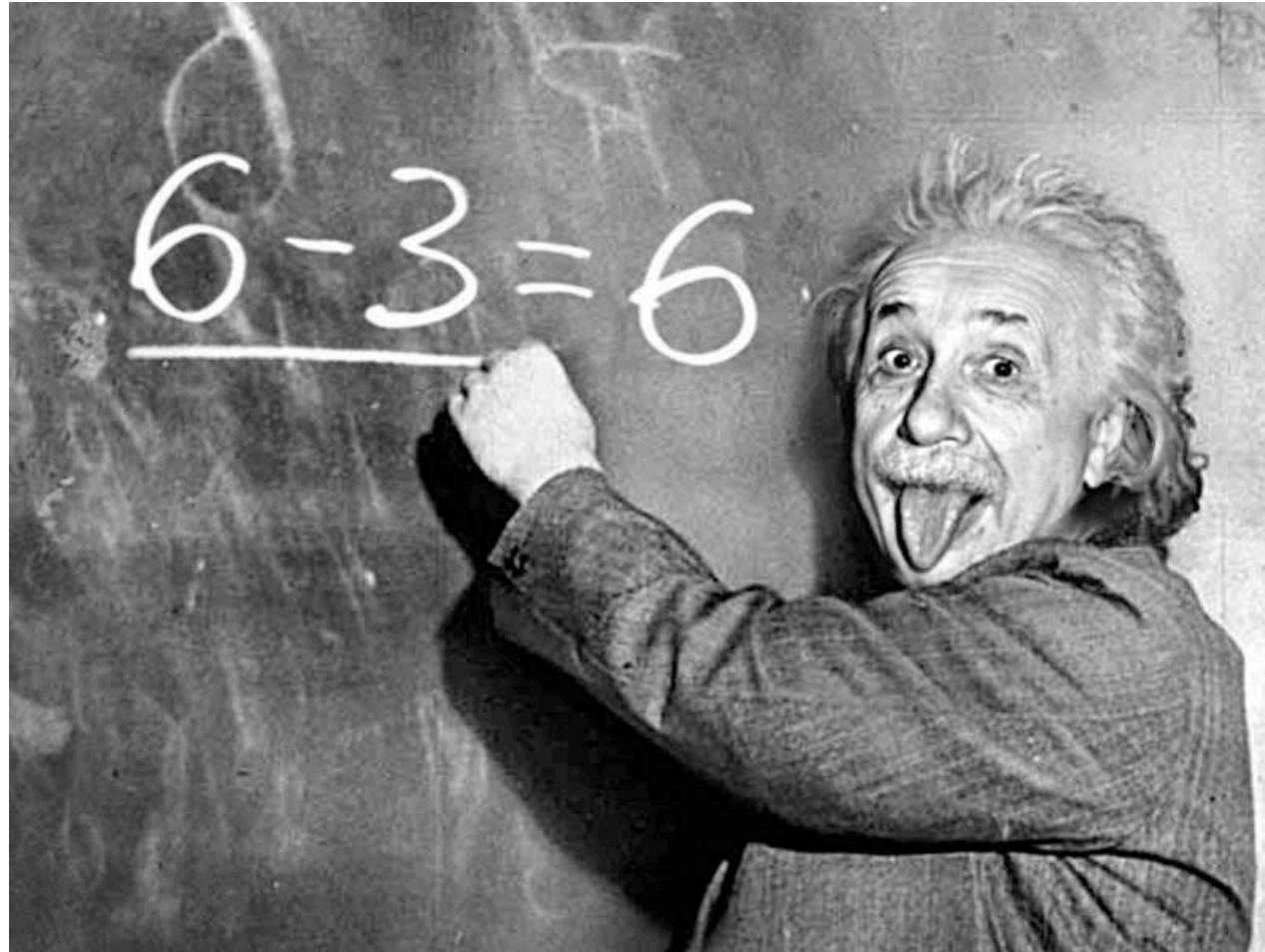
- Chapter 1: Introduction
- Chapter 2: Theory
- Chapter 3: Random boundary condition
- Chapter 4: Application to synthetic 2D data
- Chapter 5: Application to 3D marine data

## Joint Inversion of Reflectivity and Background Components (JIRB)

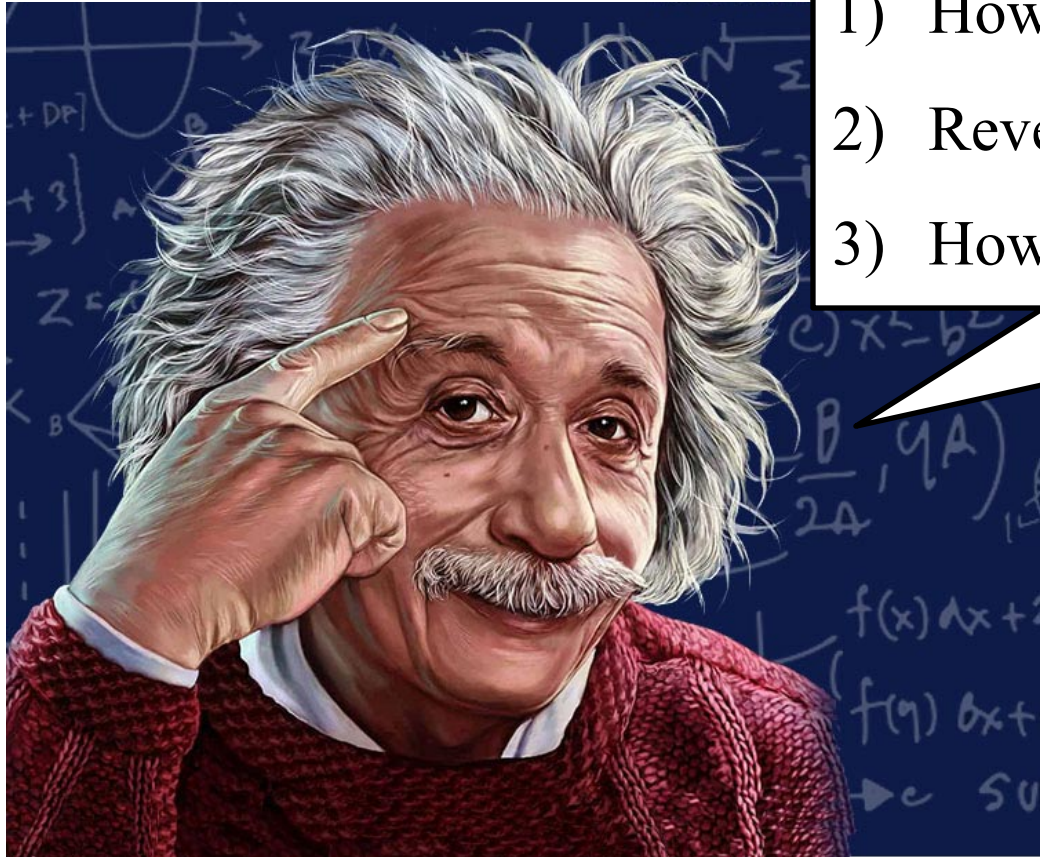
- Chapter 1: Introduction
- Chapter 2: Theory
- Chapter 3: Random boundary condition
- Chapter 4: Application to synthetic 2D data
- Chapter 5: Application to 3D marine data



# Some bits of theory



What you need to know to understand JIRB:



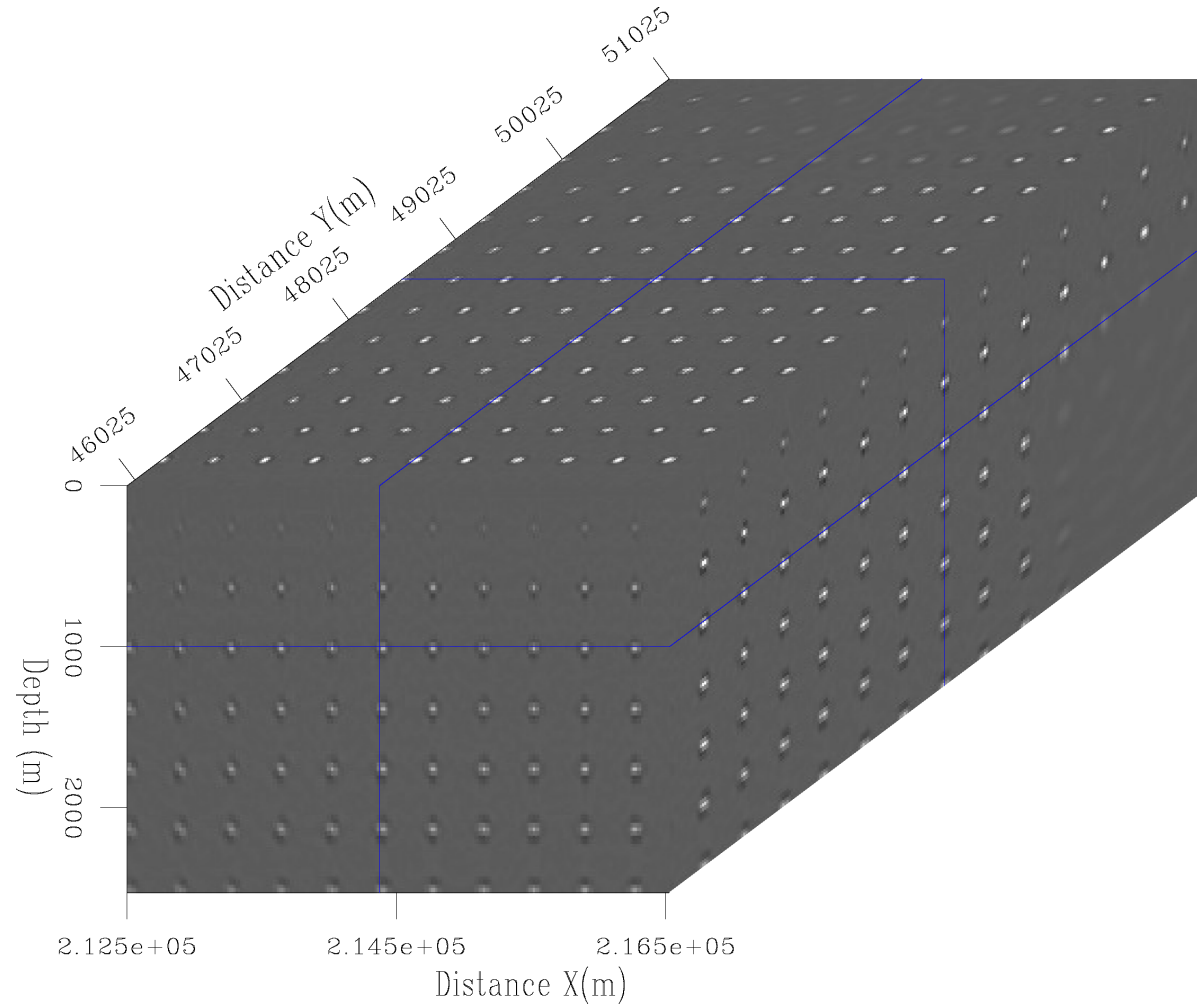
- 1) How to precompute the Hessian for LWI
- 2) Reverse-time migration (RTM)
- 3) How the WEMVA operator works



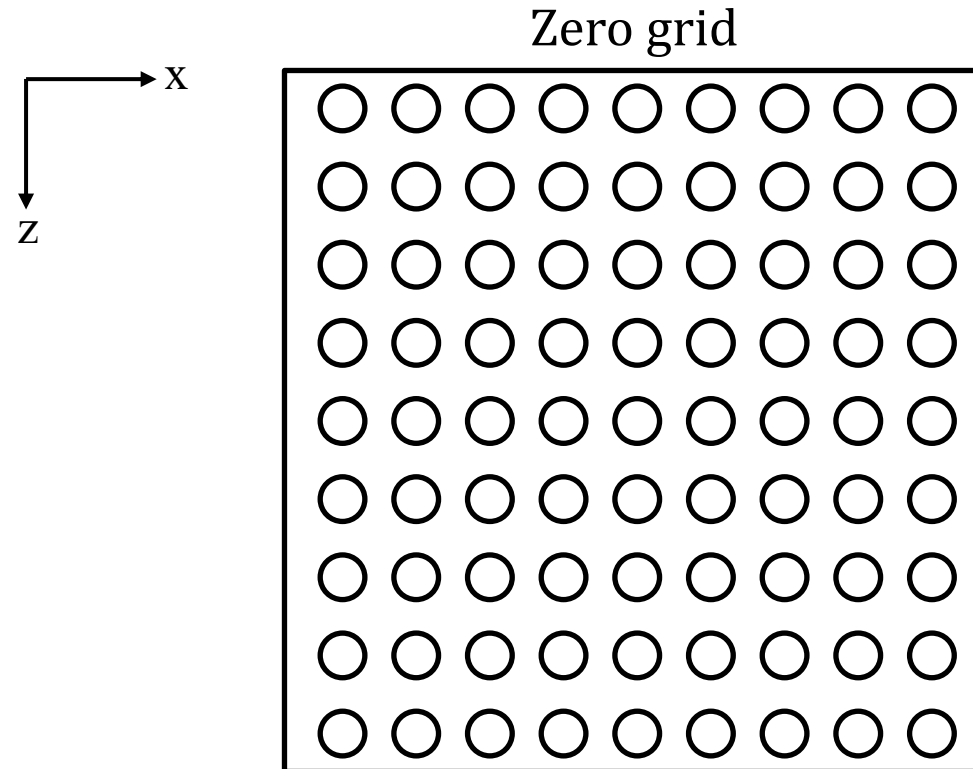


# THEORY

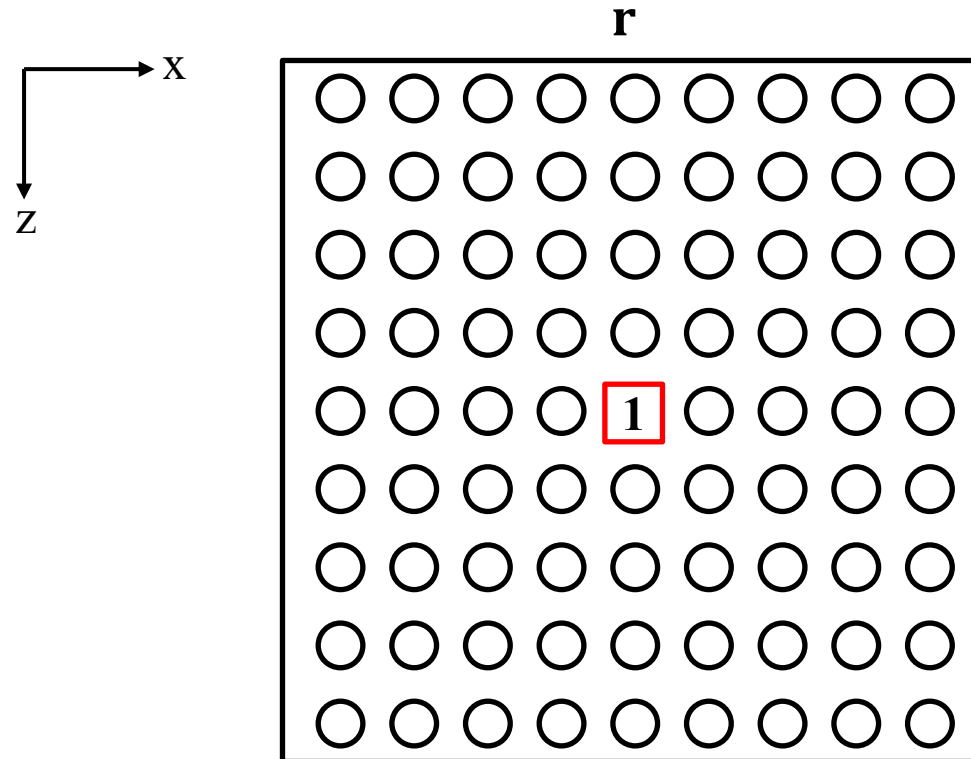
## Gauss Newton Hessian: Point-spread functions



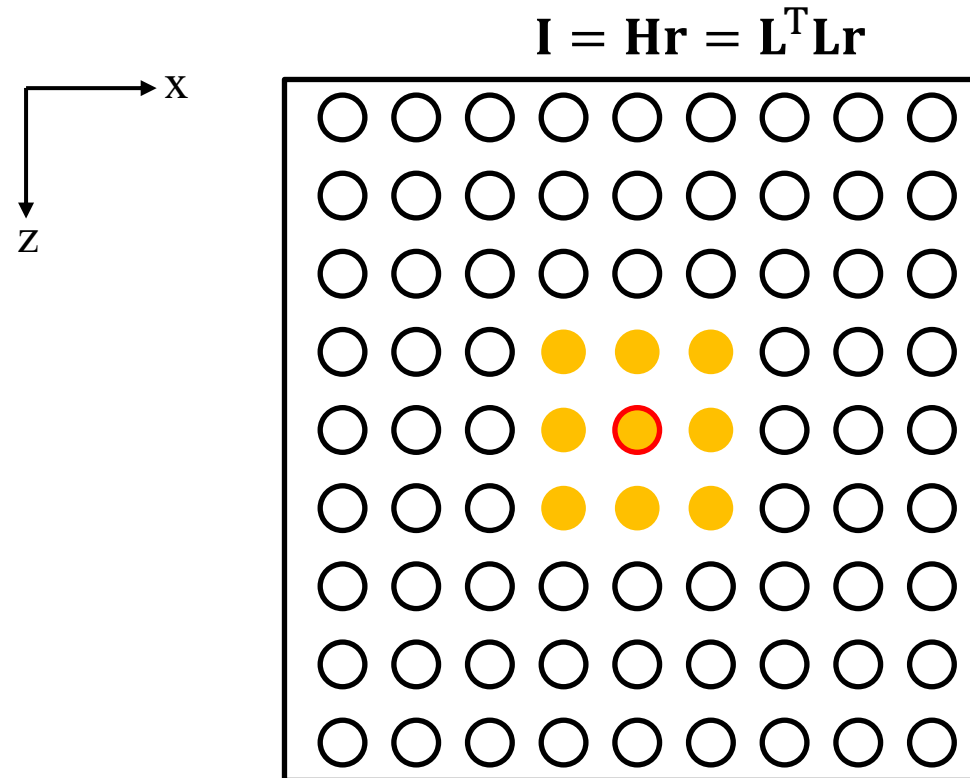
# Gauss Newton Hessian: Point-spread functions



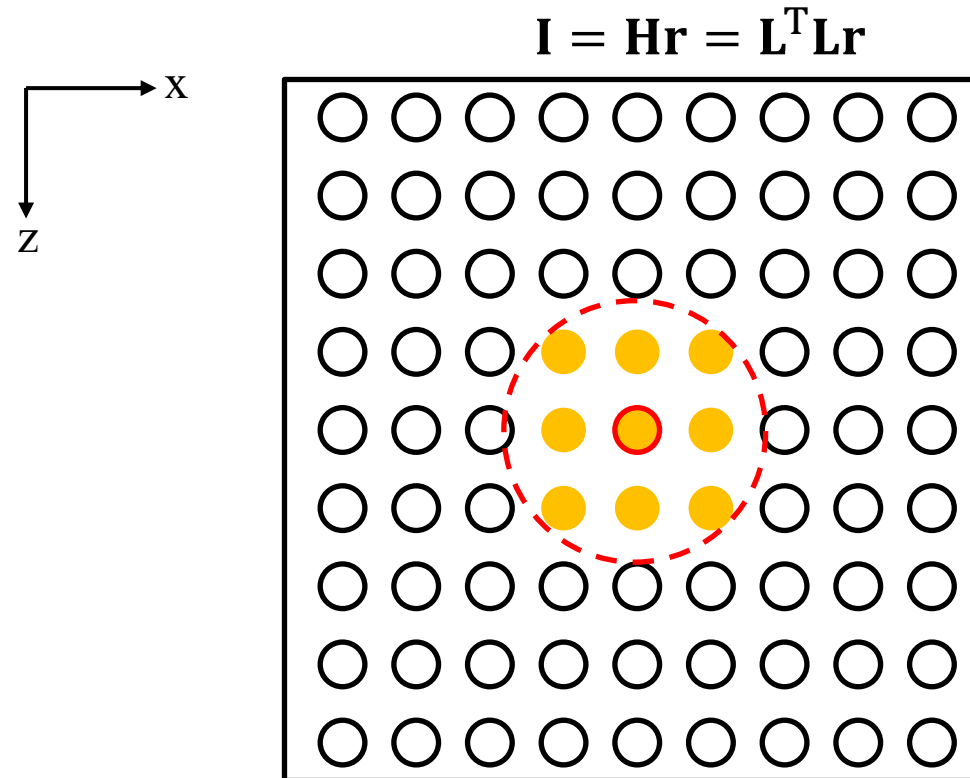
# Gauss Newton Hessian: Point-spread functions

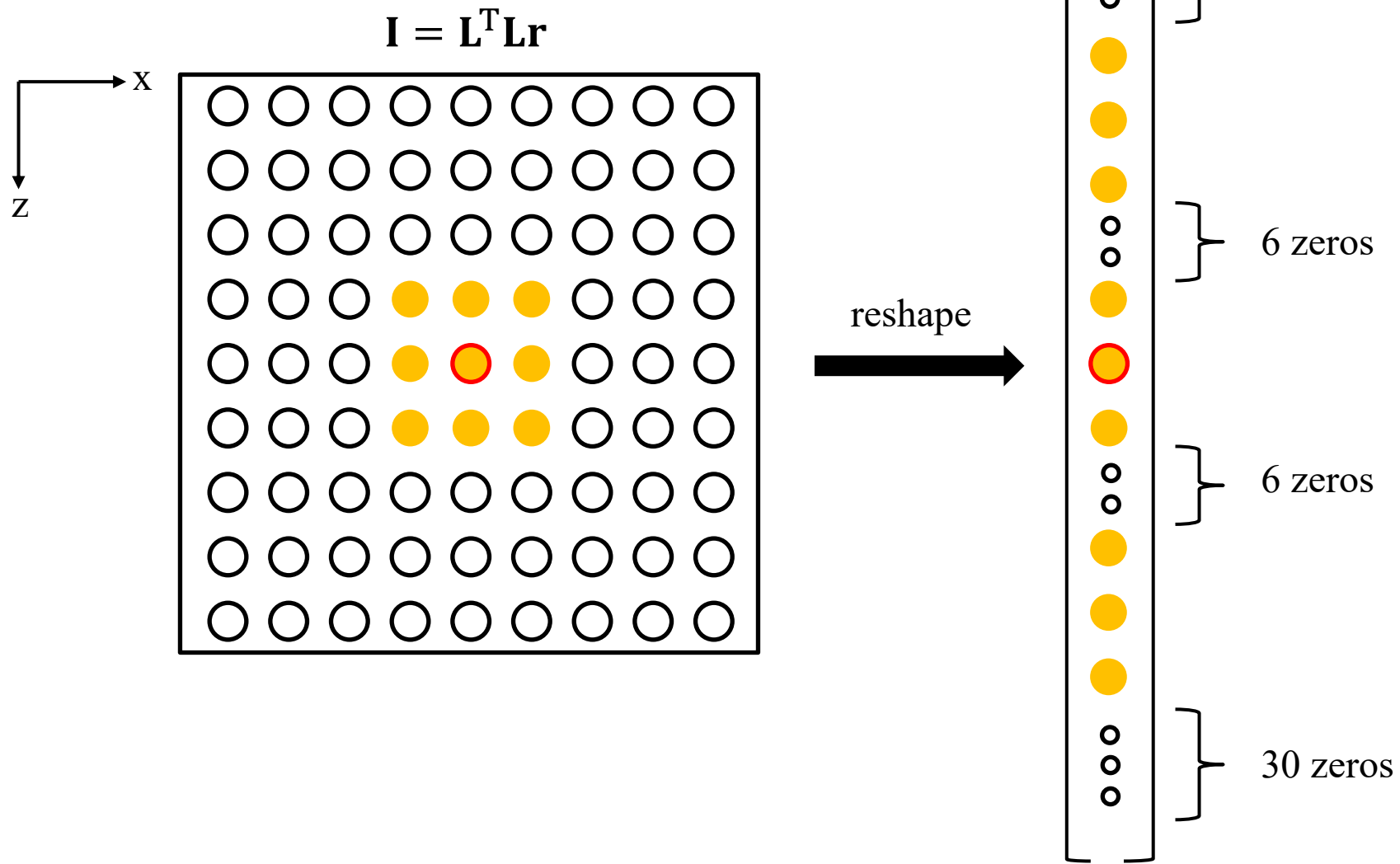


# Gauss Newton Hessian: Point-spread functions



# Gauss Newton Hessian: Point-spread functions

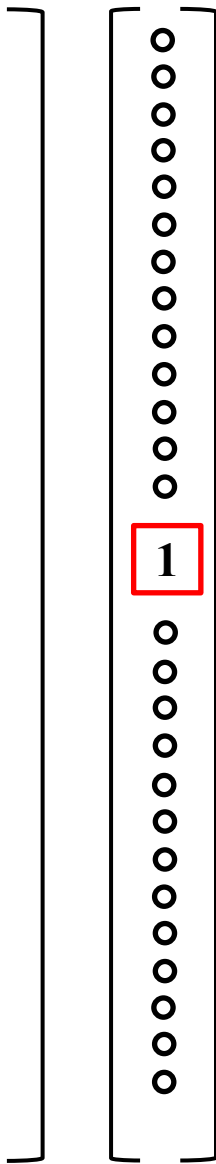




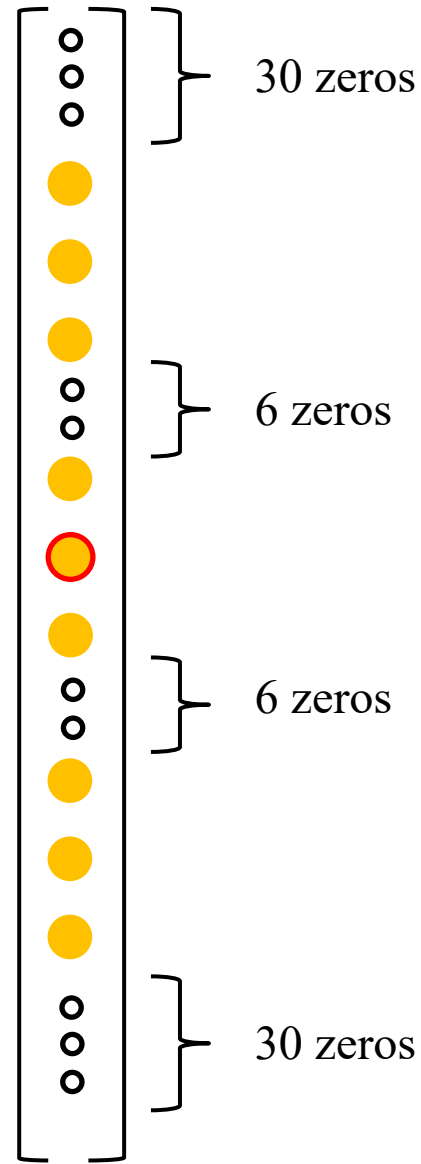
$\mathbf{H}_{81 \times 81}$

$\mathbf{r}_{81 \times 1}$

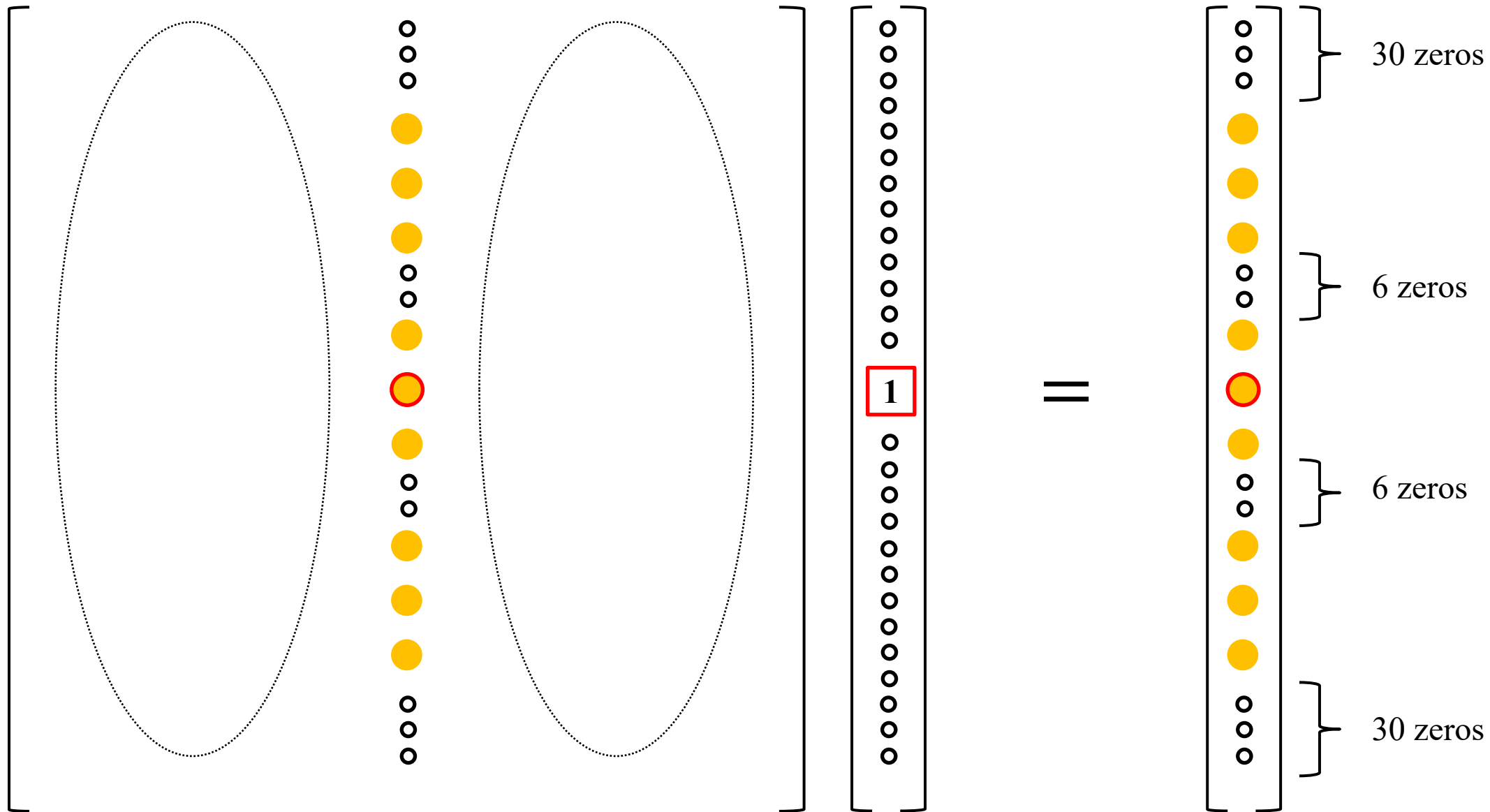
$\mathbf{I}_{81 \times 1}$

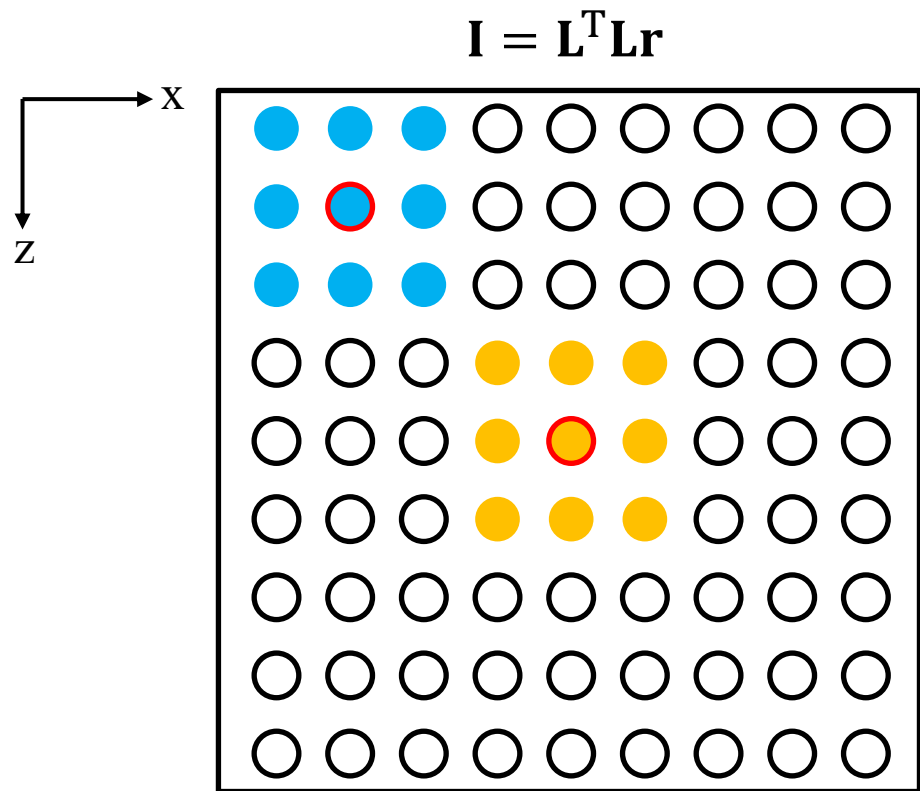


=

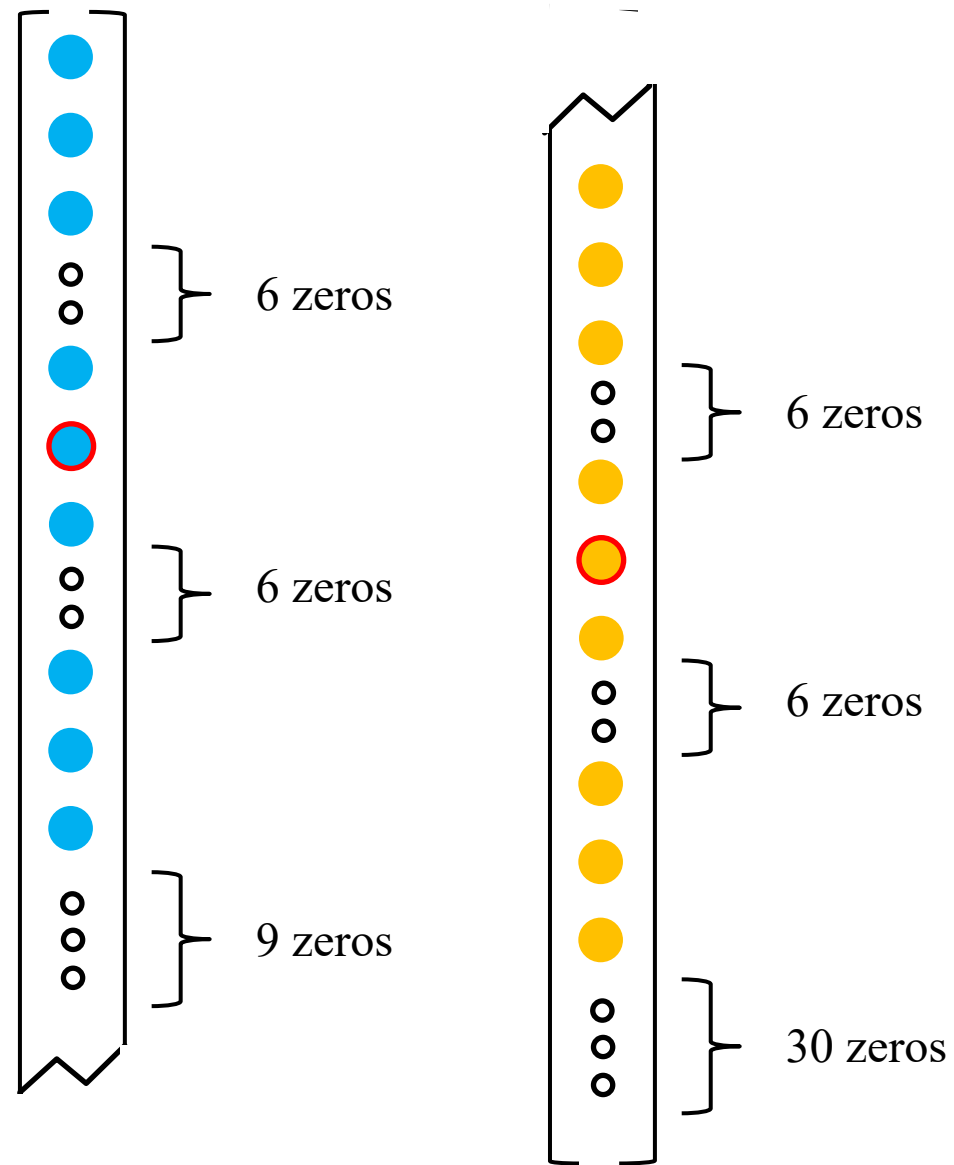


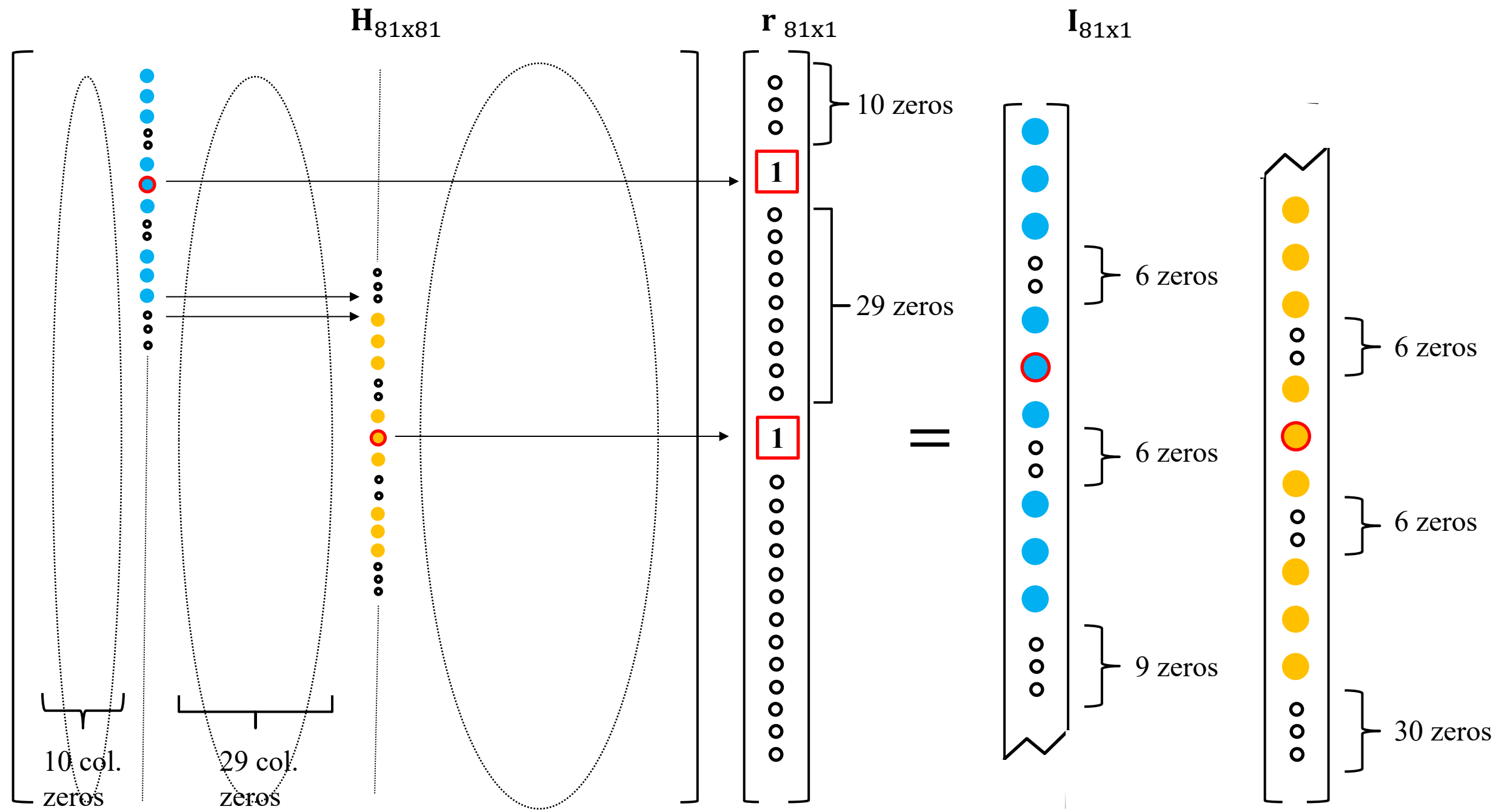


$\mathbf{H}_{81 \times 81}$  $\mathbf{r}_{81 \times 1}$  $\mathbf{I}_{81 \times 1}$ 

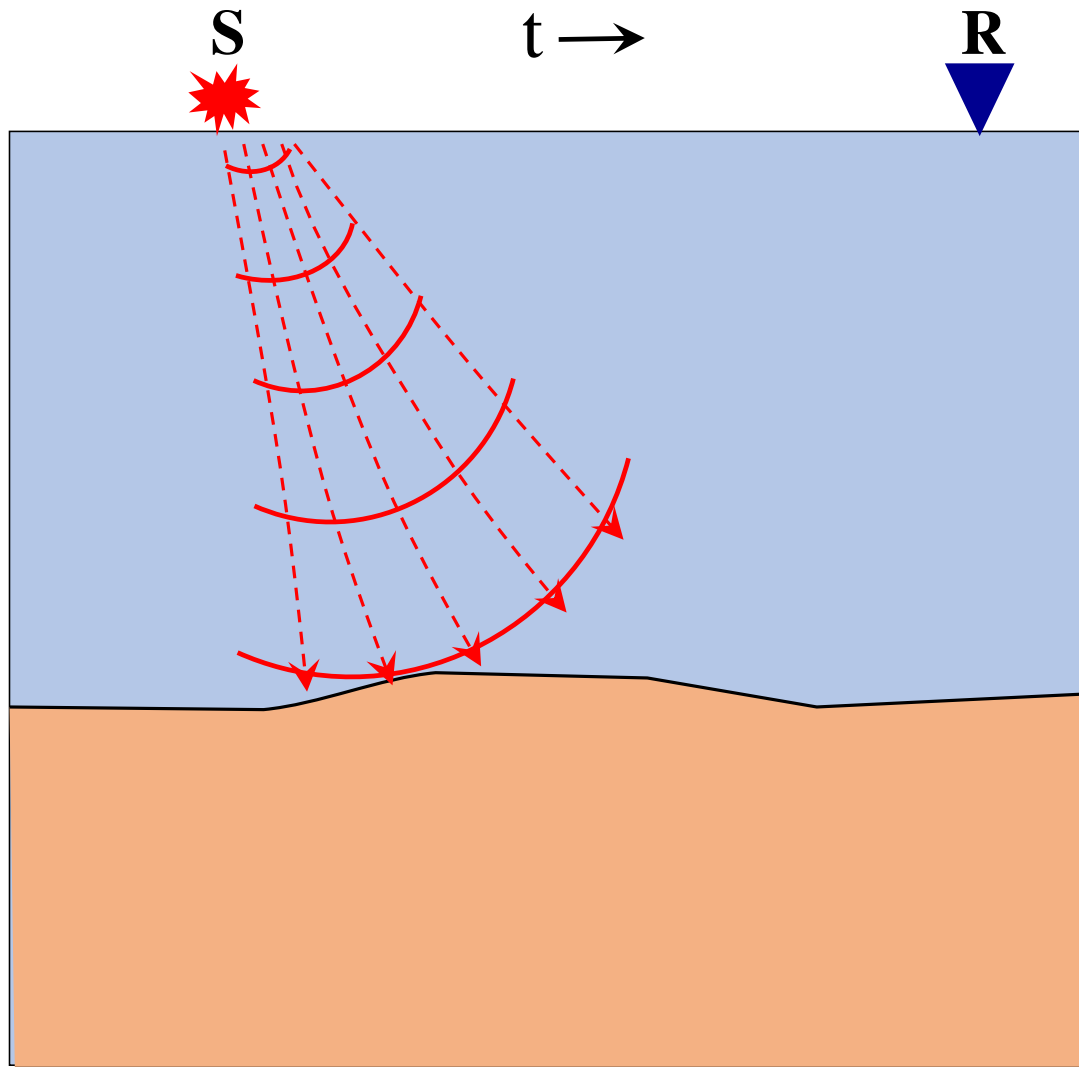


reshape





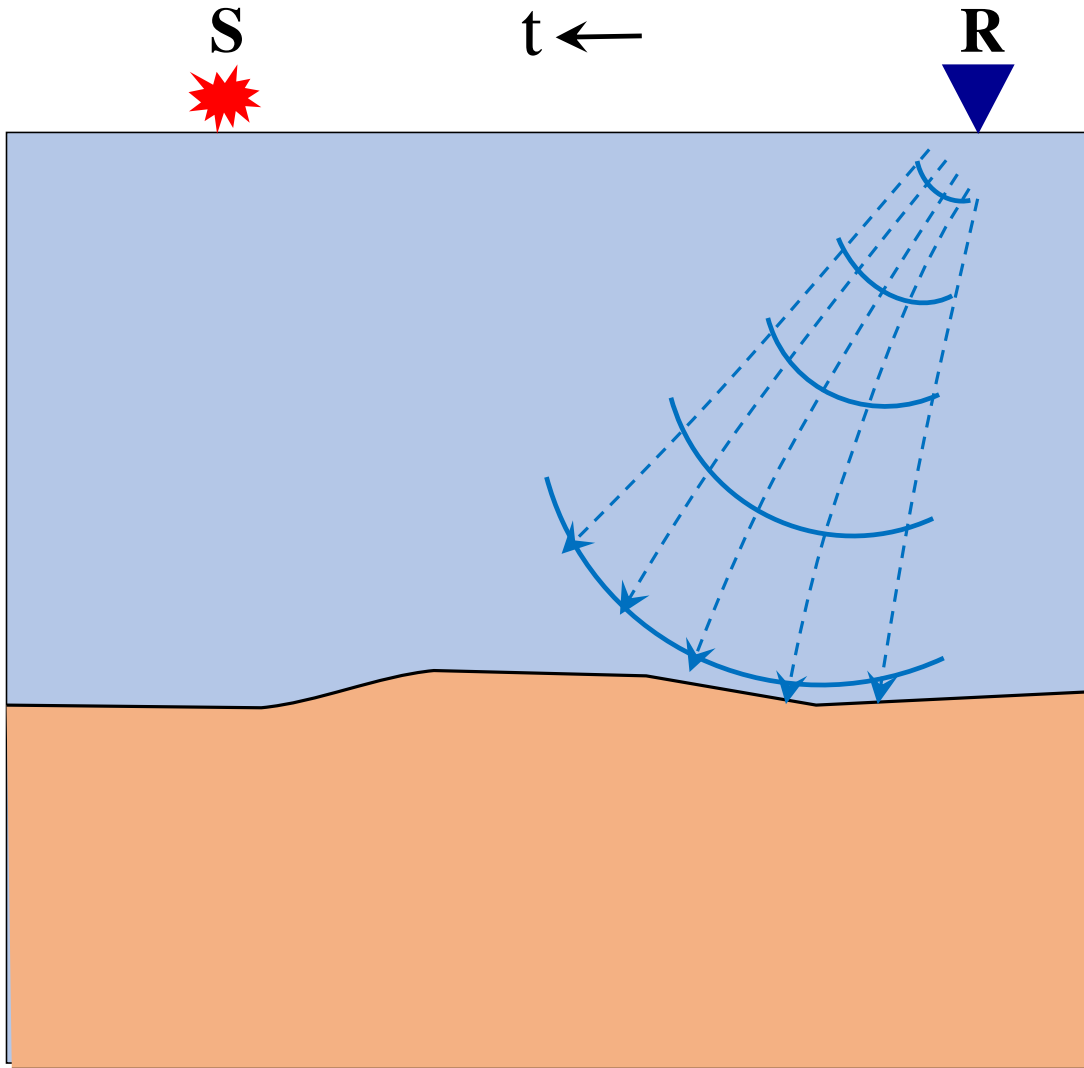
$$\text{RTM: } \mathbf{I}(\mathbf{b}) = \mathbf{L}(\mathbf{b})^T \Delta \mathbf{d}$$



Conventional reverse-time migration (RTM):

- 1) Propagate the source wavefield (Fwd in time)

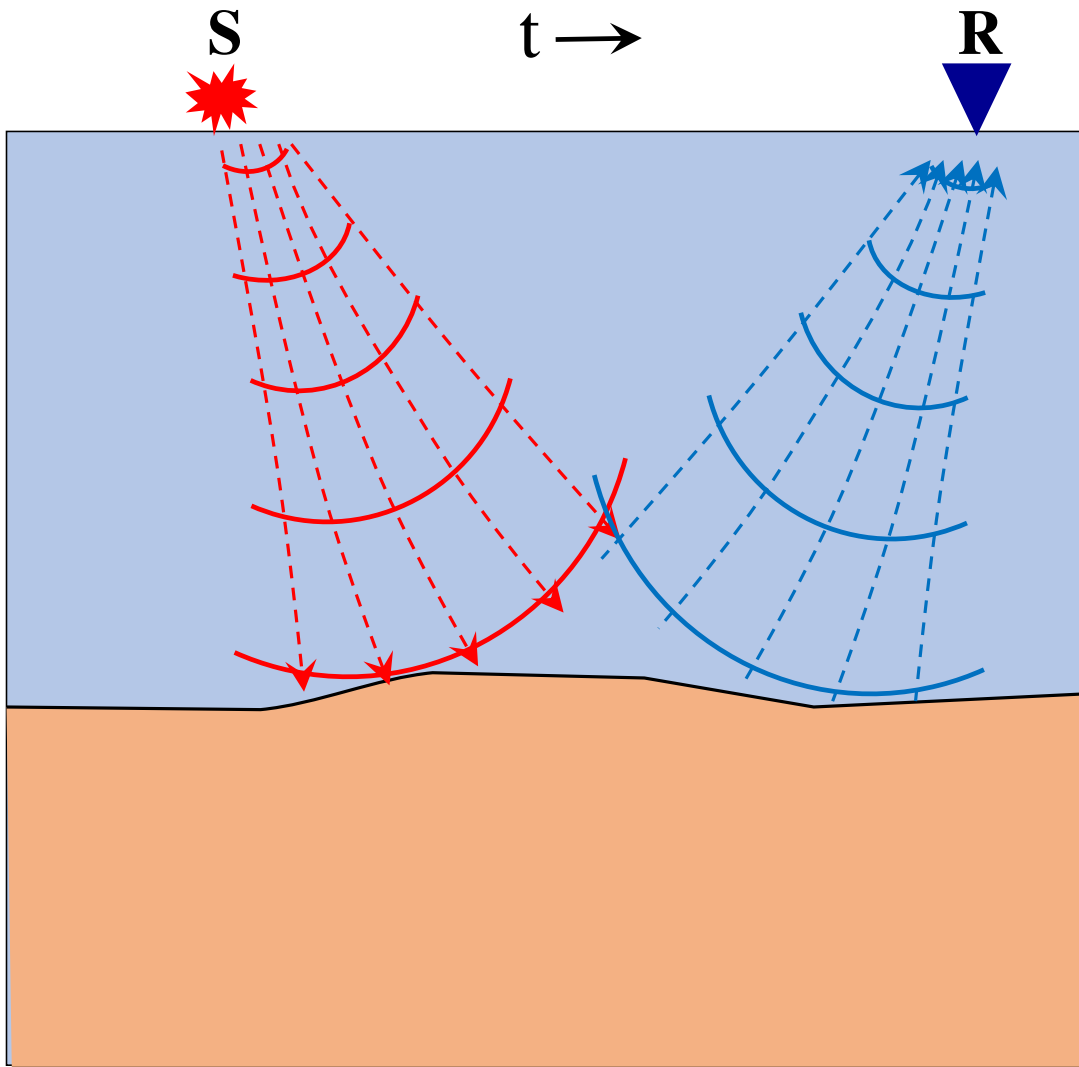
$$\text{RTM: } \mathbf{I}(\mathbf{b}) = \mathbf{L}(\mathbf{b})^T \Delta \mathbf{d}$$



Conventional reverse-time migration (RTM):

- 1) Propagate the source wavefield (Fwd in time)
- 2) Propagate the receiver wavefield (Bwd in time)

$$\text{RTM: } \mathbf{I}(\mathbf{b}) = \mathbf{L}(\mathbf{b})^T \Delta \mathbf{d}$$

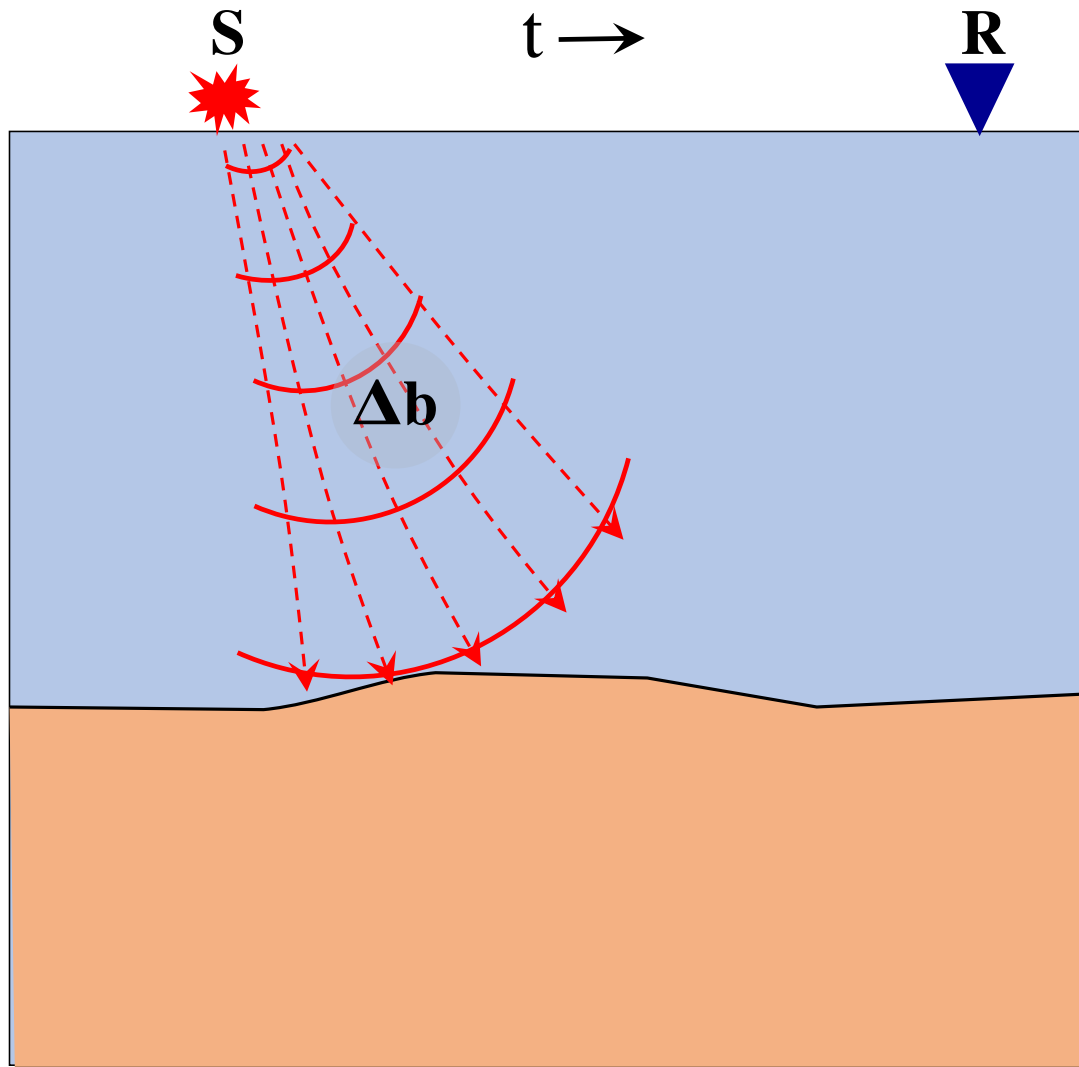


Conventional reverse-time migration (RTM):

- 1) Propagate the source wavefield (Fwd in time)
- 2) Propagate the receiver wavefield (Bwd in time)
- 3) Perform zero-lag crosscorrelation in time

$$\mathbf{I}(\mathbf{x}) = \sum_t \mathbf{S}(\mathbf{x}, t) \mathbf{R}(\mathbf{x}, t)$$

$$\text{WEMVA: } \Delta \mathbf{I} = \mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}$$

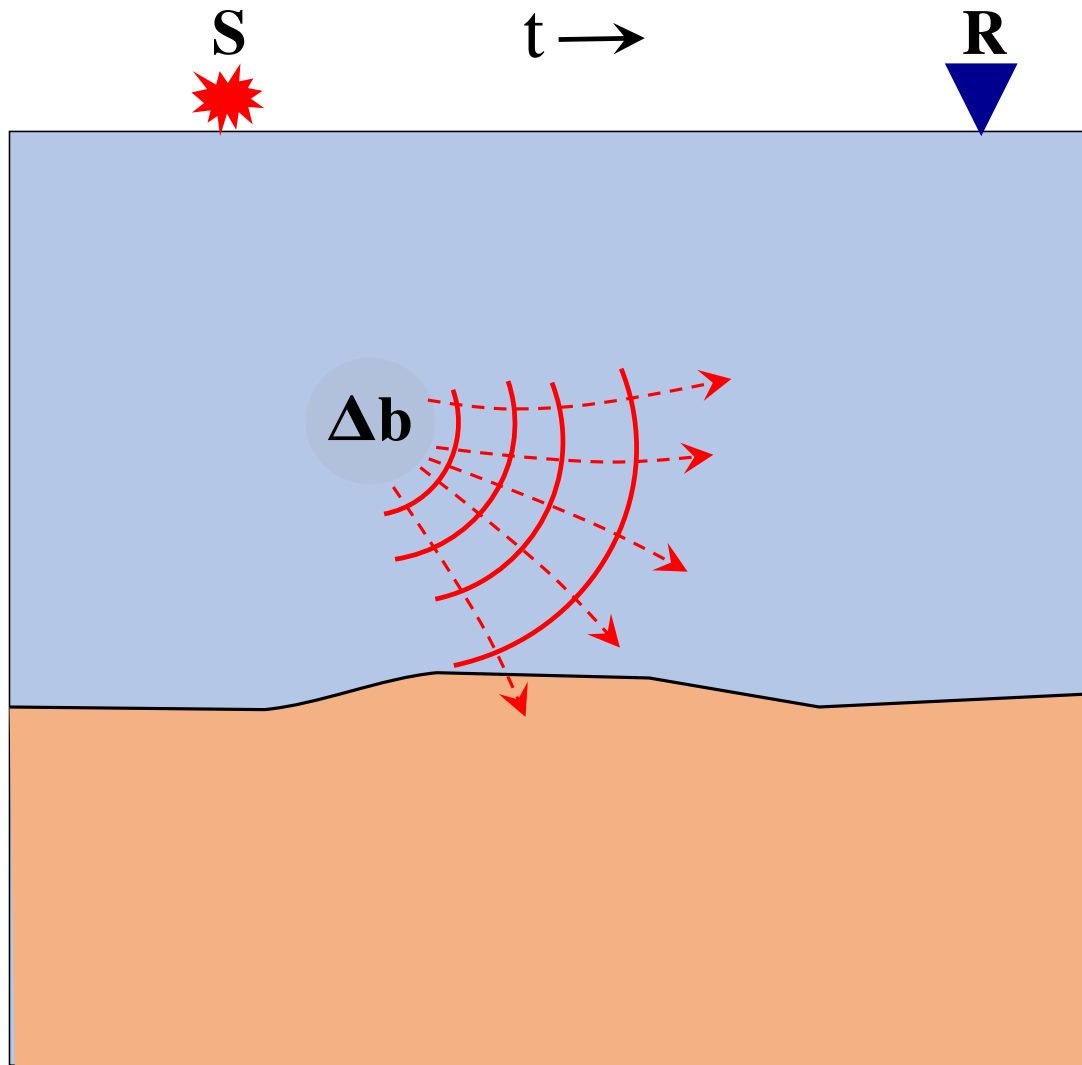


WEMVA:

- 1) Propagate the source wavefield (Fwd in time)



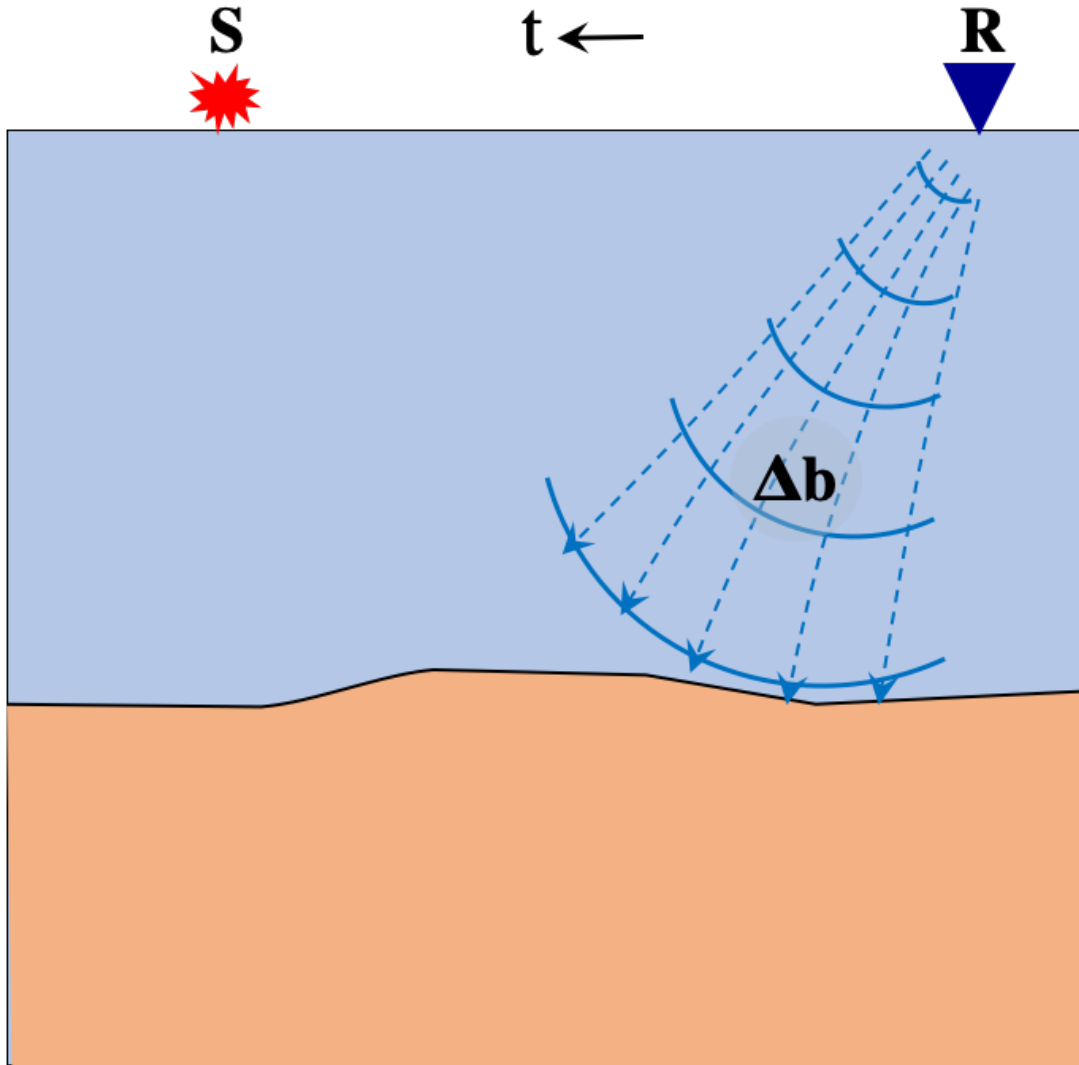
$$\text{WEMVA: } \Delta \mathbf{I} = \mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}$$



WEMVA:

- 1) Propagate the source wavefield (Fwd in time)
- 2) Scatter the source wavefield

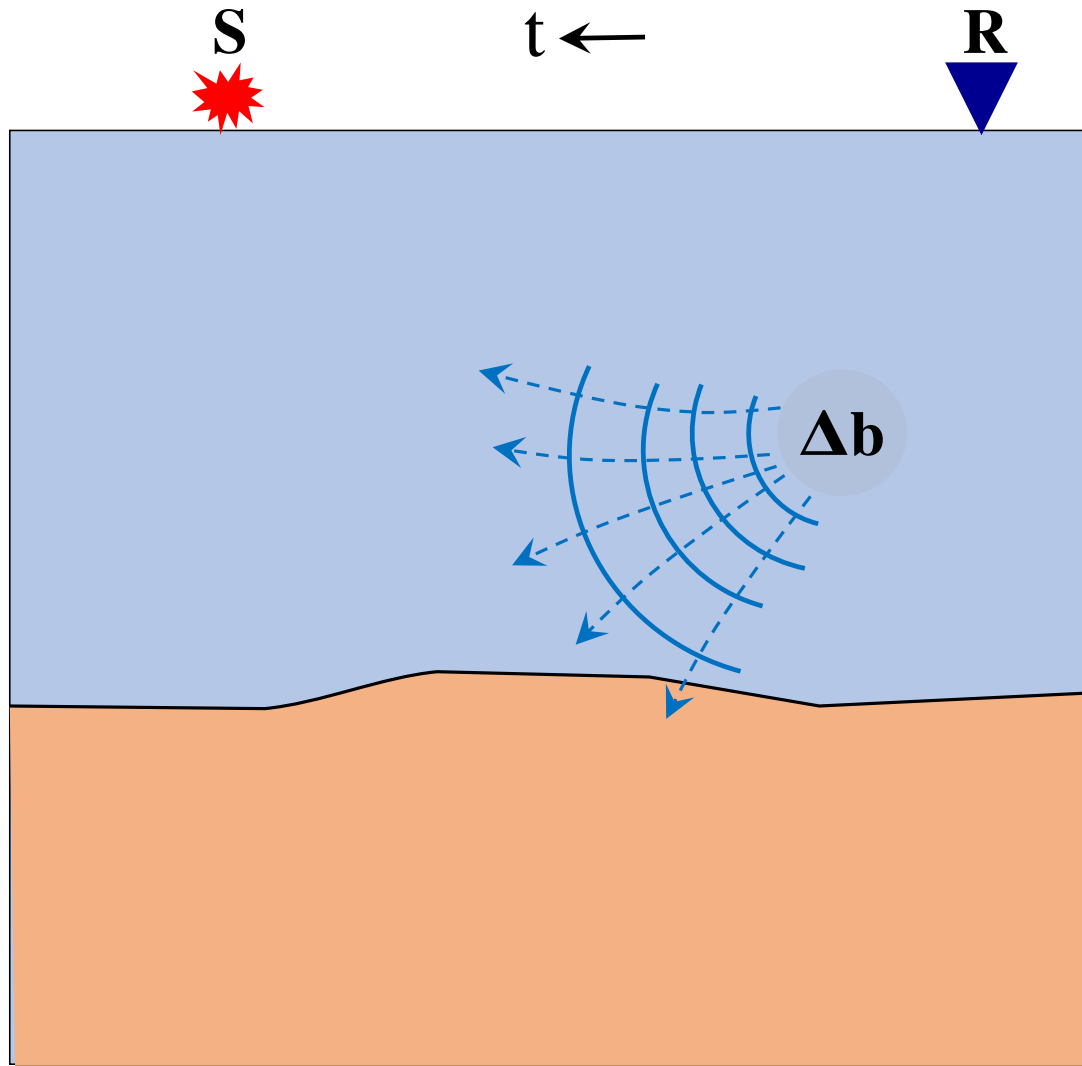
$$\text{WEMVA: } \Delta \mathbf{I} = \mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}$$



WEMVA:

- 1) Propagate the source wavefield (Fwd in time)
- 2) Scatter the source wavefield
- 3) Propagate the receiver wavefield (Bwd in time)

$$\text{WEMVA: } \Delta \mathbf{I} = \mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}$$

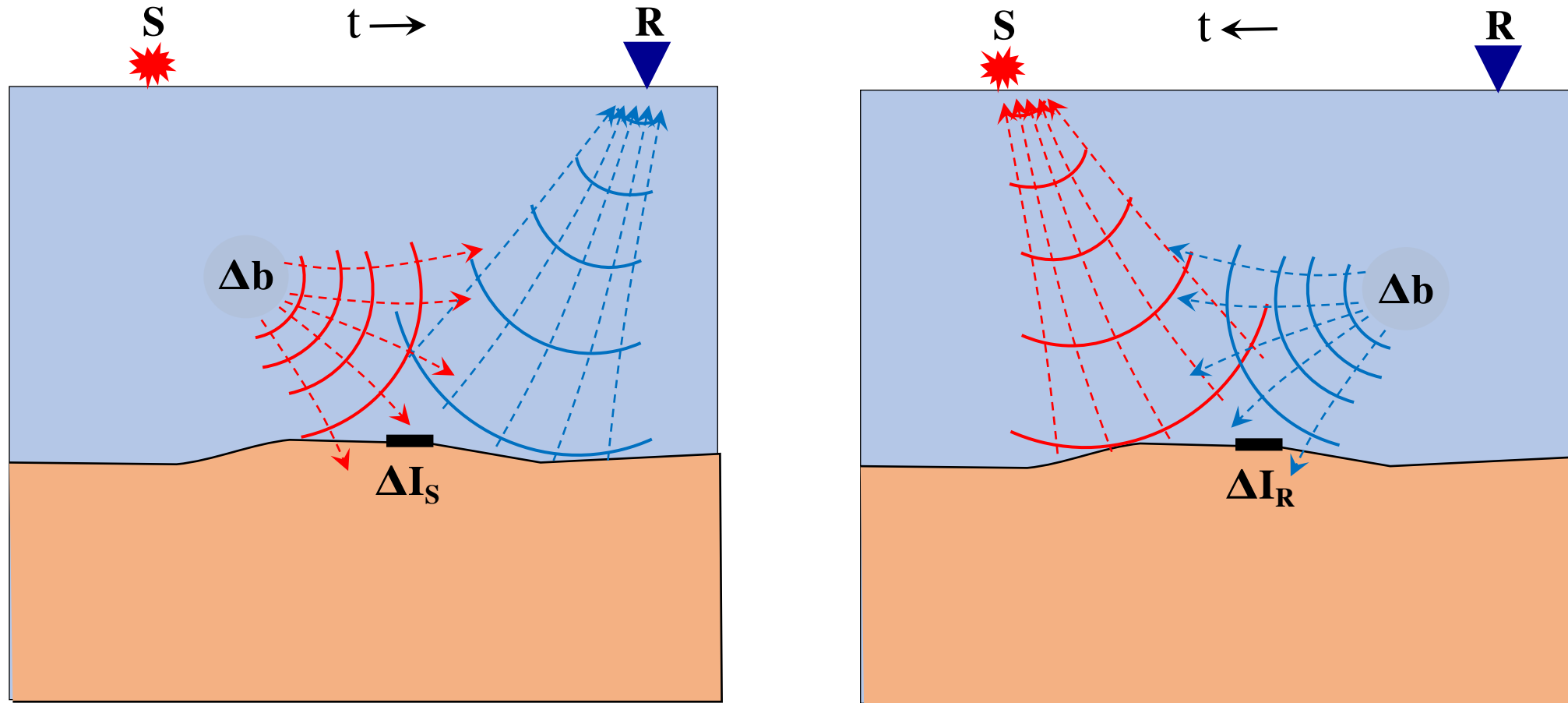


WEMVA:

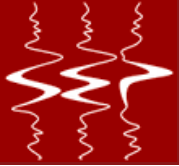
- 1) Propagate the source wavefield (Fwd in time)
- 2) Scatter the source wavefield
- 3) Propagate the receiver wavefield (Bwd in time)
- 4) Scatter the receiver wavefield

$$\text{WEMVA: } \Delta \mathbf{I} = \mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}$$

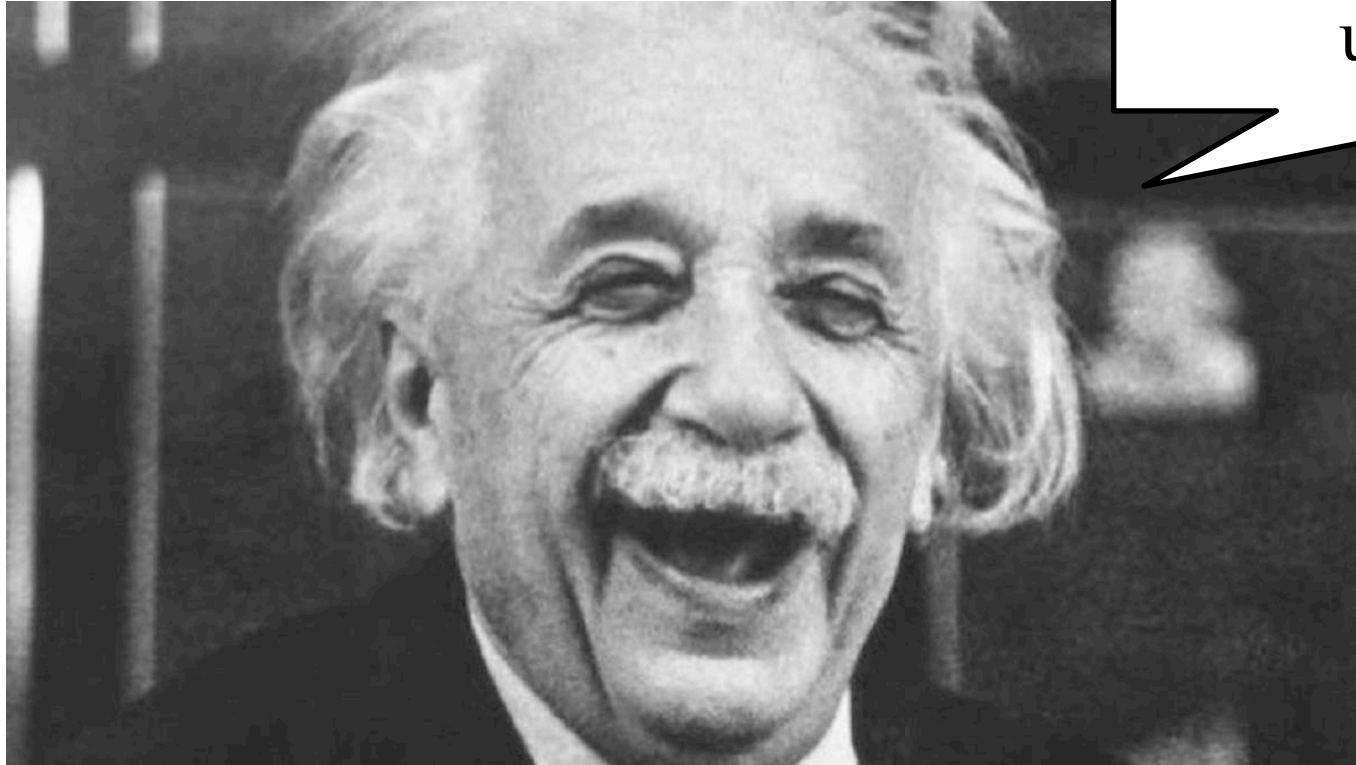
5) Perform crosscorrelations:



$$\Delta \mathbf{I}(\mathbf{x}) = \sum_t [\delta \mathbf{S}(\mathbf{x}, t) \mathbf{R}(\mathbf{x}, t) + \mathbf{S}(\mathbf{x}, t) \delta \mathbf{R}(\mathbf{x}, t)] = \Delta \mathbf{I}_S(\mathbf{x}) + \Delta \mathbf{I}_R(\mathbf{x})$$



# THEORY

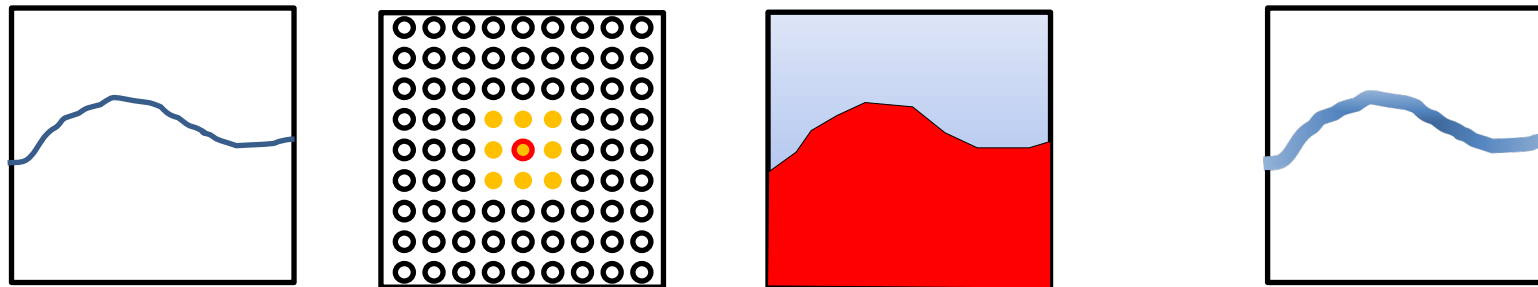


Good! Now you're prepared to understand JIRB!

## Joint inversion of reflectivity and background components

Start with conventional LWI (image space):

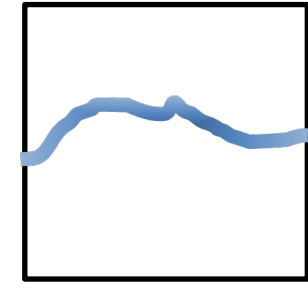
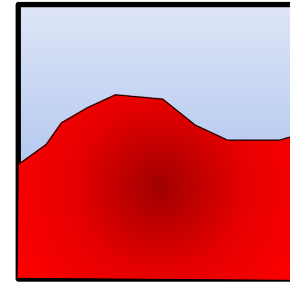
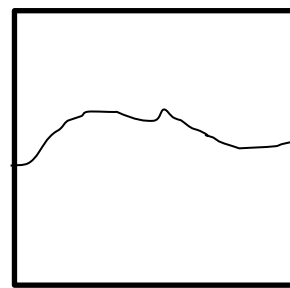
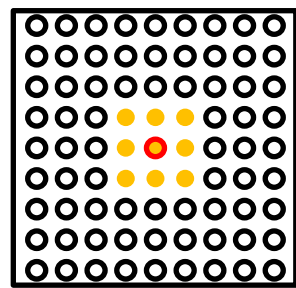
$$\Phi(\mathbf{r}) = \|\mathbf{H}(\mathbf{b}_0)\mathbf{r} - \mathbf{I}(\mathbf{b}_0)\|_2^2$$



## Joint inversion of reflectivity and background components

Make of  $\mathbf{b}$  another model parameter:

$$\Phi(\mathbf{r}, \mathbf{b}) = \|\mathbf{H}(\mathbf{b})\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2 - \lambda \|\mathbf{I}(\mathbf{b})\|_2^2$$

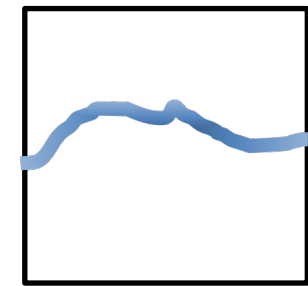
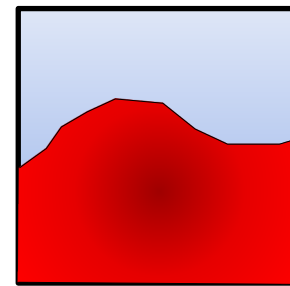
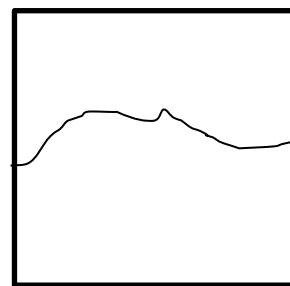
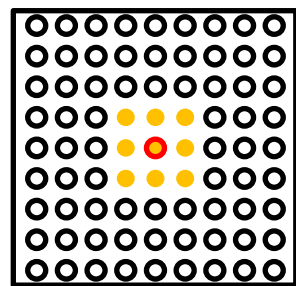




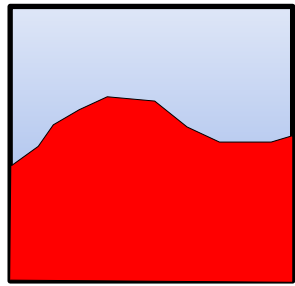
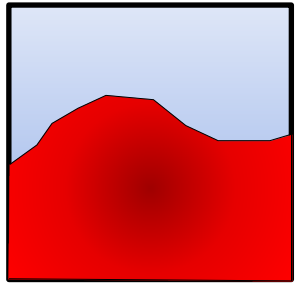
## Joint inversion of reflectivity and background components

Make of  $\mathbf{b}$  another model parameter:

$$\Phi(\mathbf{r}, \mathbf{b}) = \|\mathbf{H}(\mathbf{b})\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2 - \lambda \|\mathbf{I}(\mathbf{b})\|_2^2$$



Original idea: Linearizing



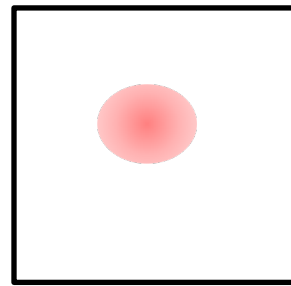
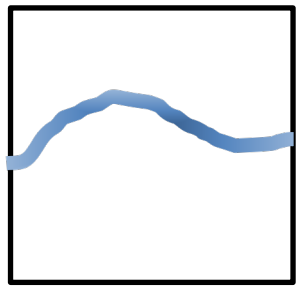
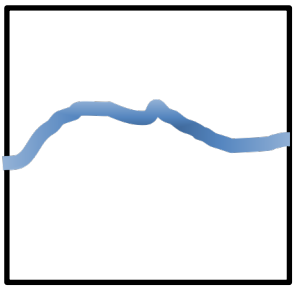
$\mathbf{I}(\mathbf{b})$

$\approx \mathbf{I}(\mathbf{b}_0)$

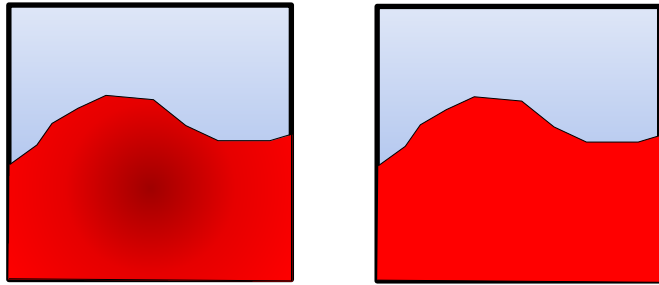
+

$$\left[ \frac{\partial \mathbf{I}(\mathbf{b}_0)}{\partial \mathbf{b}} \right] \Delta \mathbf{b}$$

$\Delta \mathbf{b}$



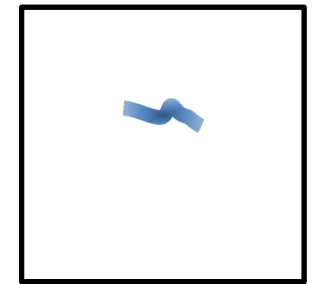
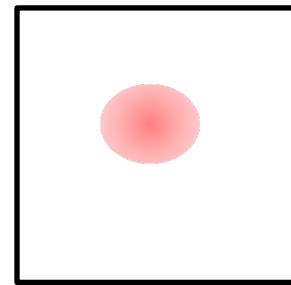
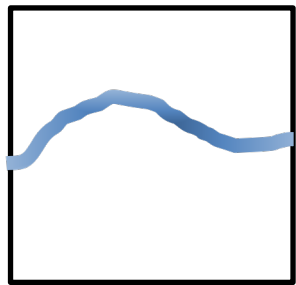
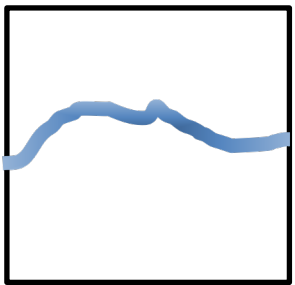
Original idea: Linearizing



$\mathbf{I}(\mathbf{b})$

$\approx \mathbf{I}(\mathbf{b}_0)$

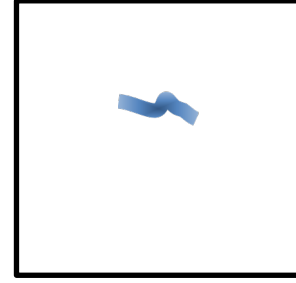
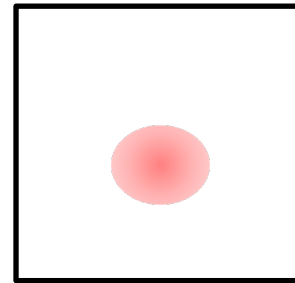
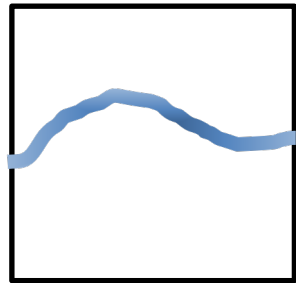
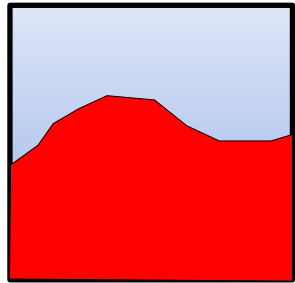
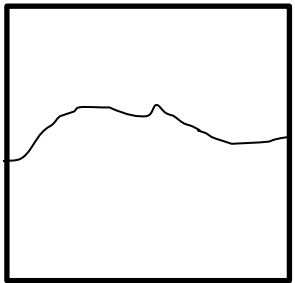
$$+ \left[ \frac{\partial \mathbf{I}(\mathbf{b}_0)}{\partial \mathbf{b}} \right] \Delta \mathbf{b} = \mathbf{I}(\mathbf{b}_0) + \underbrace{\mathbf{W}(\mathbf{b}_0) \Delta \mathbf{b}}$$



## Original idea: Linearizing

Substitute expanded image into objective function:

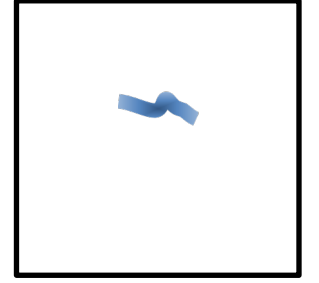
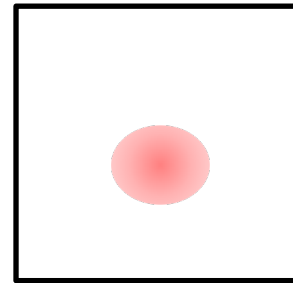
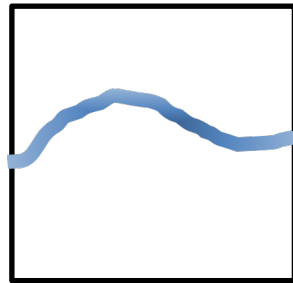
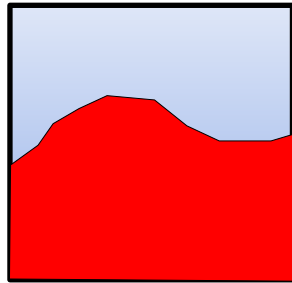
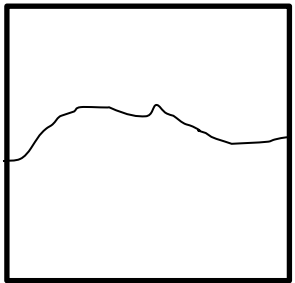
$$\Phi(\mathbf{r}, \Delta \mathbf{b}) = \|\mathbf{H}(\mathbf{b}_0 + \Delta \mathbf{b})\mathbf{r} - \overset{0}{\mathbf{I}(\mathbf{b}_0) - \mathbf{W}(\mathbf{b}_0)\Delta \mathbf{b}}\|_2^2 - \lambda \|\mathbf{I}(\mathbf{b}_0) + \underbrace{\mathbf{W}(\mathbf{b}_0)\Delta \mathbf{b}}\|_2^2$$



## Original idea: Linearizing

Substitute expanded image into objective function:

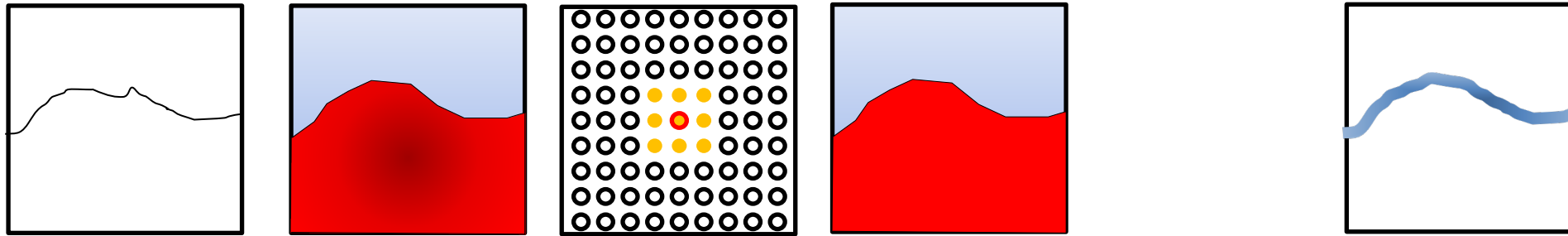
$$\Phi(\mathbf{r}, \Delta\mathbf{b}) = \|\mathbf{H}(\mathbf{b}_0 + \Delta\mathbf{b})\mathbf{r} - \overset{0}{\mathbf{I}(\mathbf{b}_0) - \mathbf{W}(\mathbf{b}_0)\Delta\mathbf{b}}\|_2^2 - \lambda \|\underbrace{\mathbf{I}(\mathbf{b}_0) + \mathbf{W}(\mathbf{b}_0)\Delta\mathbf{b}}\|_2^2$$



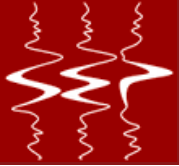
**This linearization scheme didn't work!!!**

Solution: Set JIRB as a nonlinear problem

$$\Phi(\mathbf{r}, \mathbf{b}) = \|\mathbf{H}(\mathbf{b}_0)\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2 - \lambda\|\mathbf{I}(\mathbf{b})\|_2^2$$



$$\mathbf{H}(\mathbf{b})\mathbf{r} \approx \mathbf{H}(\mathbf{b}_0)\mathbf{r}$$



# Numerical Results



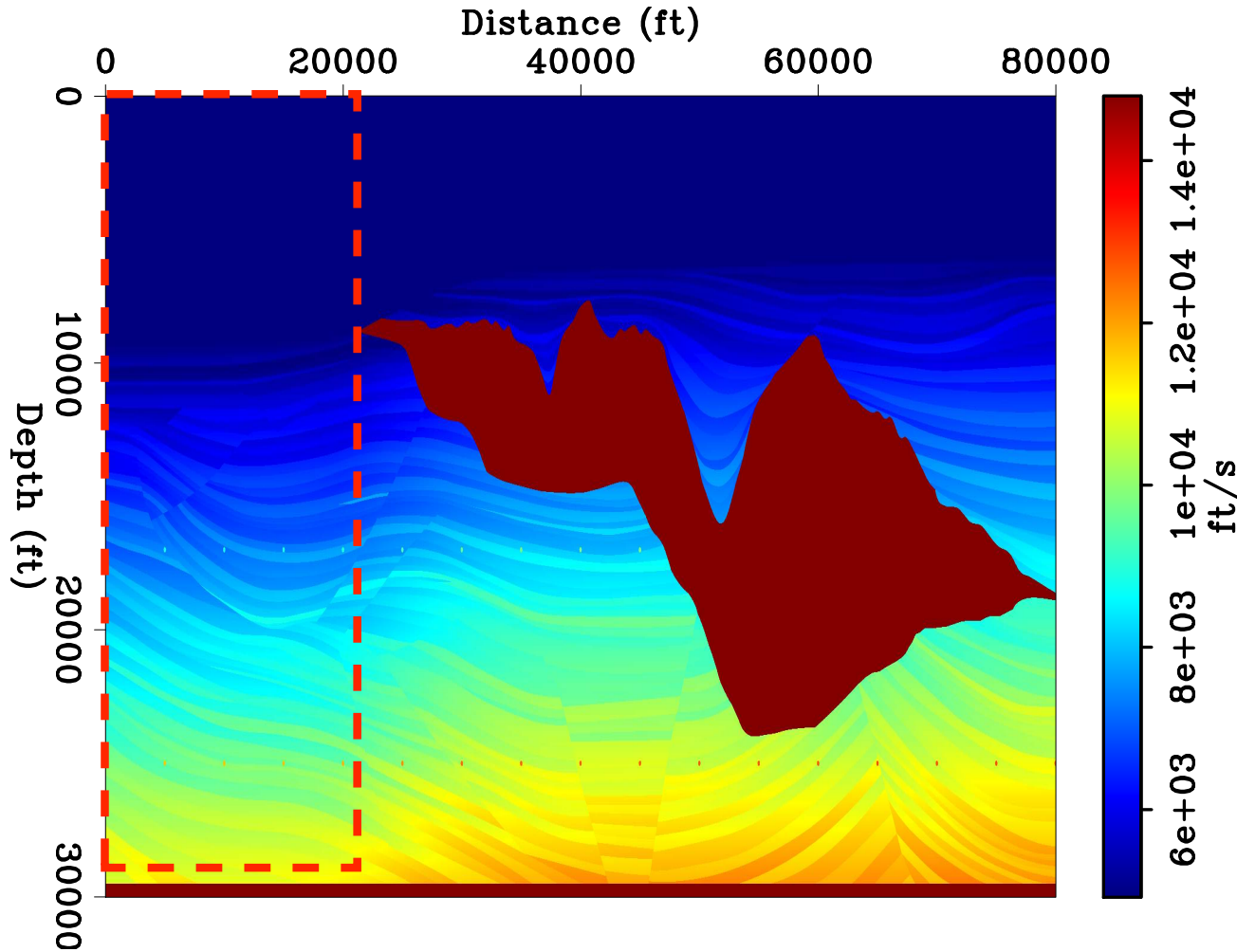




# 2D NUMERICAL TESTS



## 2D synthetic test: Preliminaries



Velocity model (sed. Section Sigsbee):

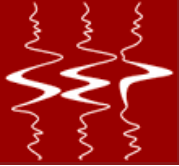
- Horizontal: 20,000 ft (6096 m)
- Vertical: 27,000 ft (8230 m)
- Spacing: 75 ft (22.86)

Acquisition geometry:

- 54 split-spread shots
- 651 receivers per shot
- Shot spacing: 500 ft (152.4 m)
- Receiver spacing: 75 ft (22.86)

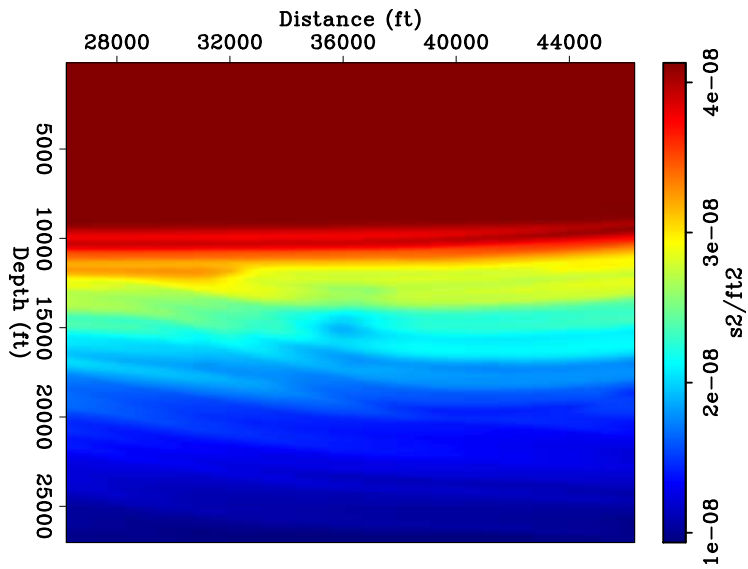
Imaging:

- Inversions ran until line search failed



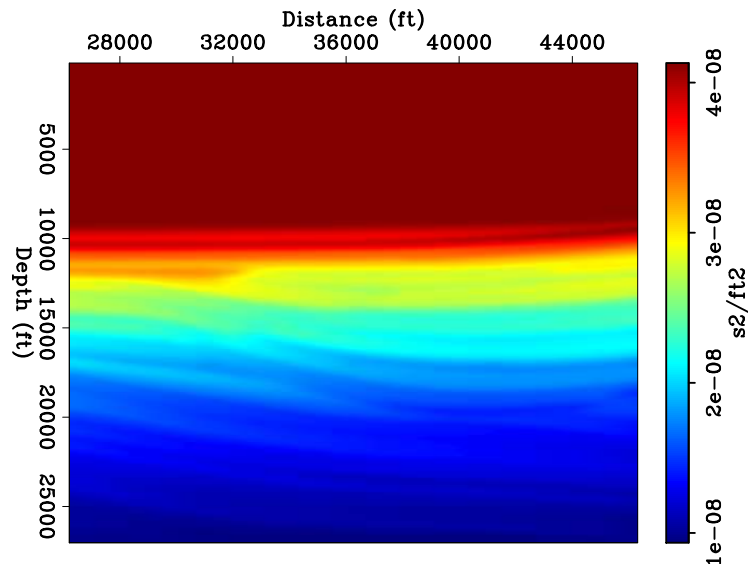
# 2D NUMERICAL RESULTS

## 2D synthetic test: Preliminaries



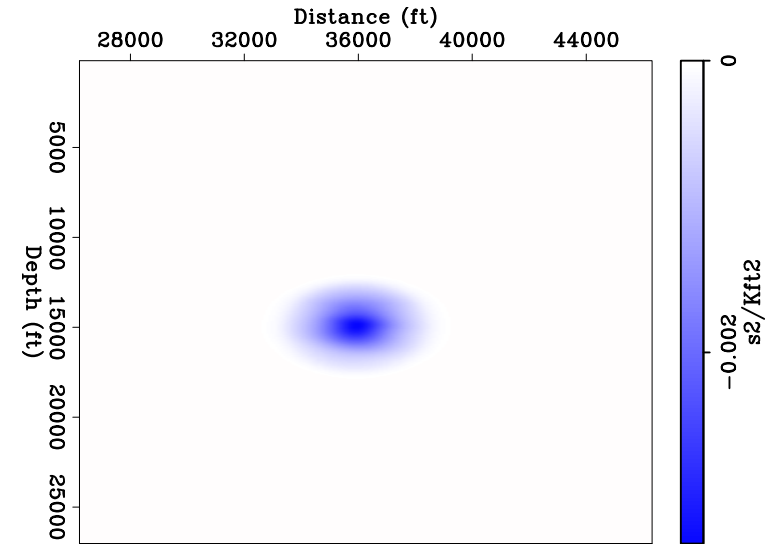
**b**

**=**



**b<sub>0</sub>**

**+**



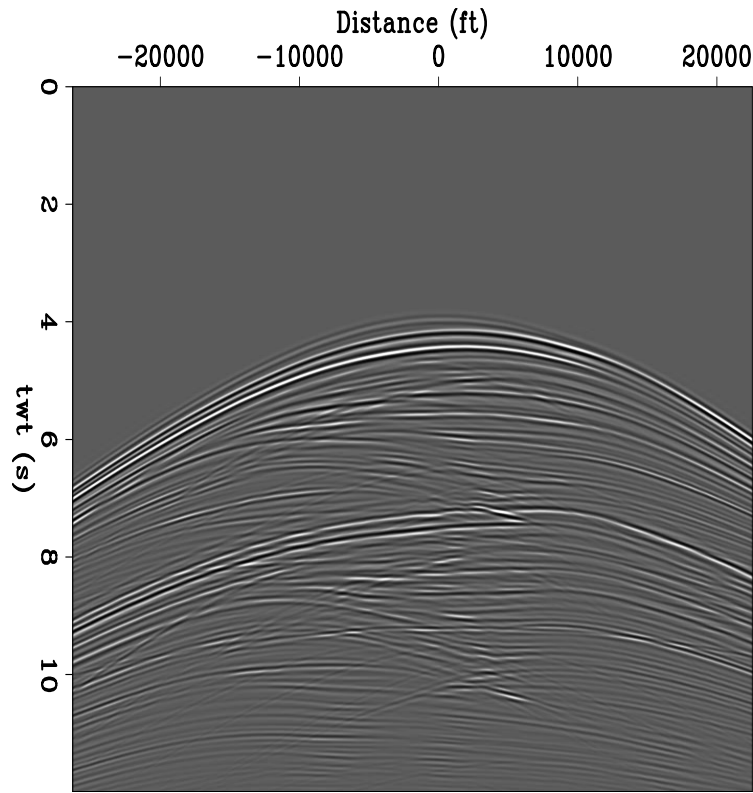
**$\Delta b$**



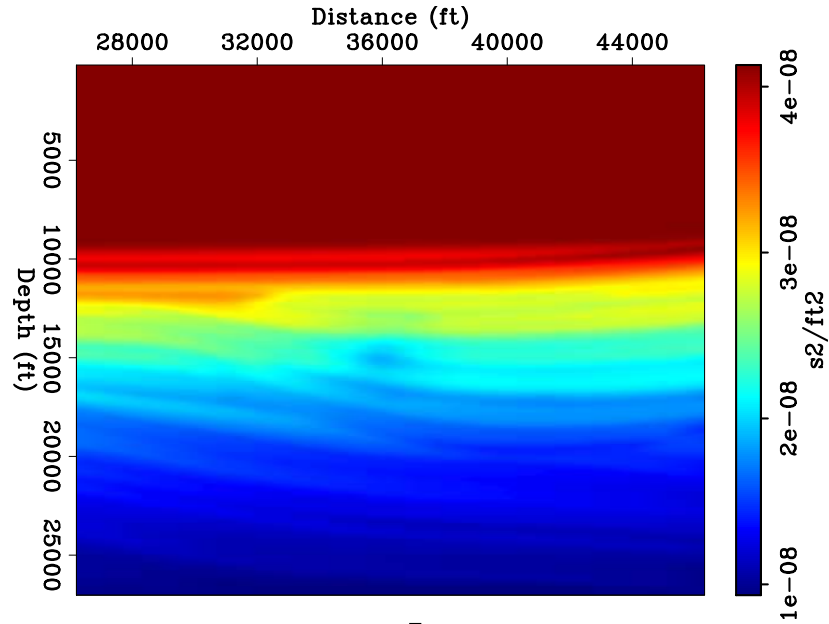


# 2D NUMERICAL RESULTS

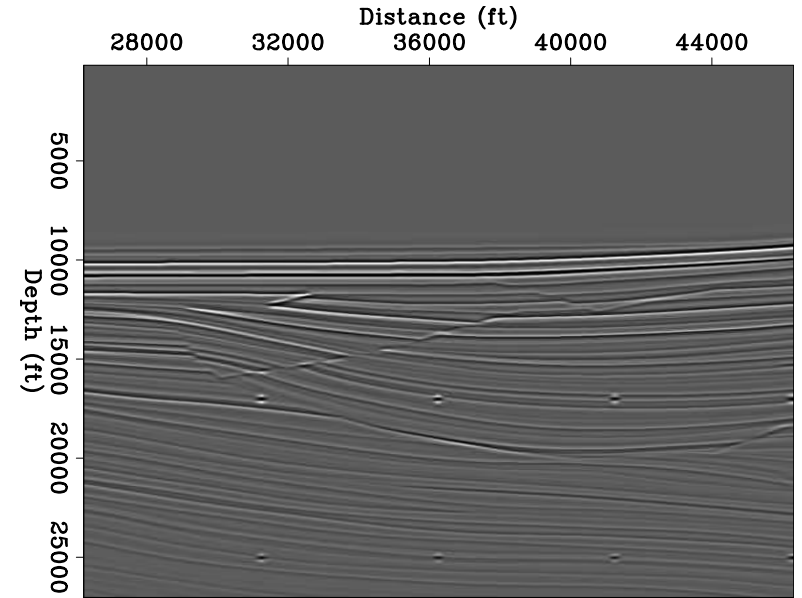
## 2D synthetic test: Preliminaries



$\mathbf{d}_{\text{obs}}$



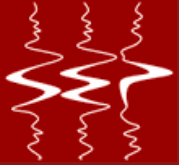
$\mathbf{b}$



$\mathbf{r}$

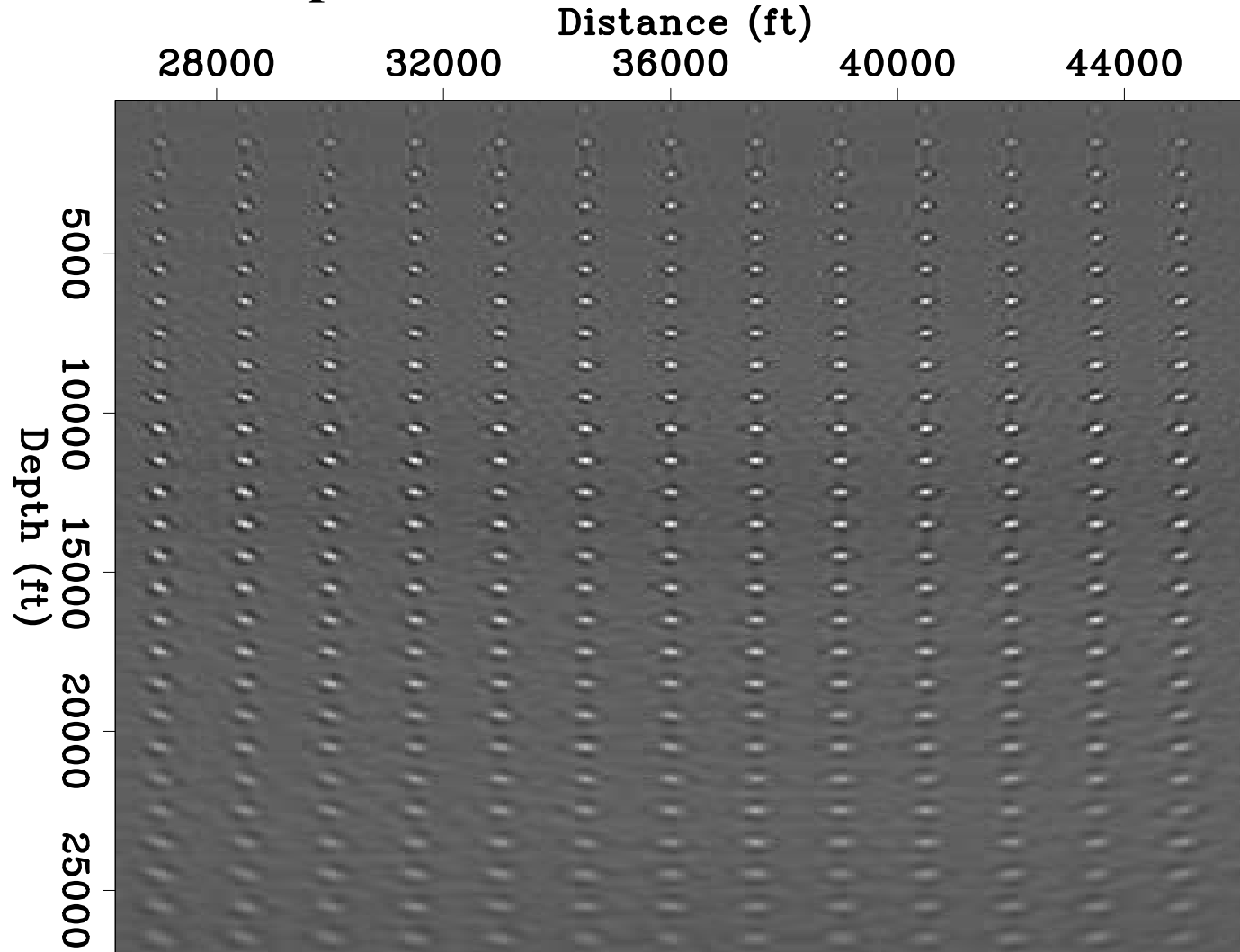
Born modeled data:

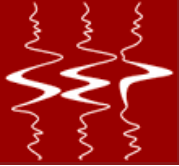
$$\mathbf{d}_{\text{obs}} = \mathbf{L}(\mathbf{b})\mathbf{r}$$



# 2D NUMERICAL RESULTS

## Point-spread functions: Hessian estimation

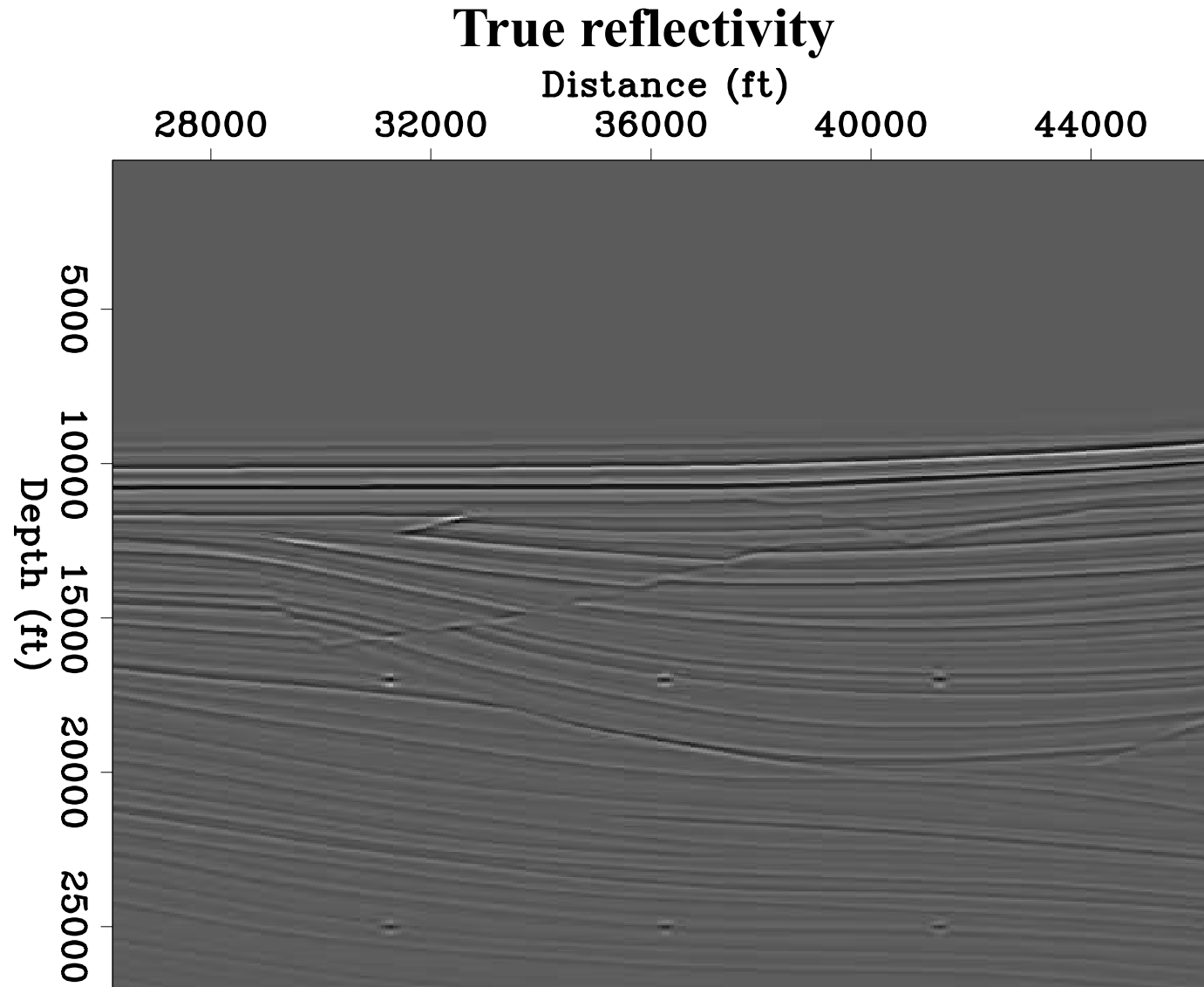




# Reflectivity model: True reflectivity vs. LWI



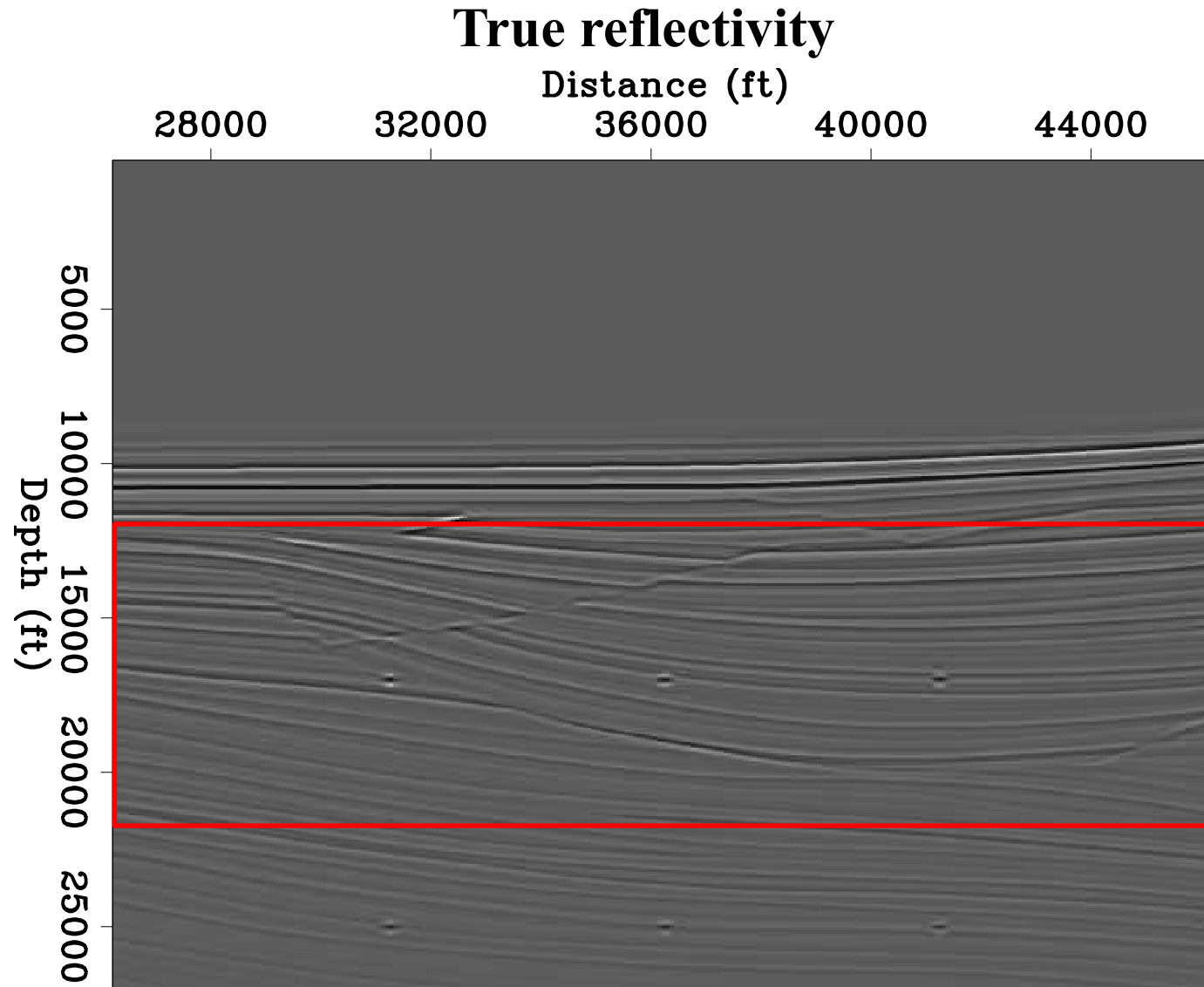
# 2D NUMERICAL RESULTS

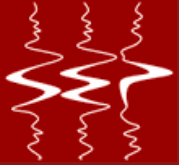




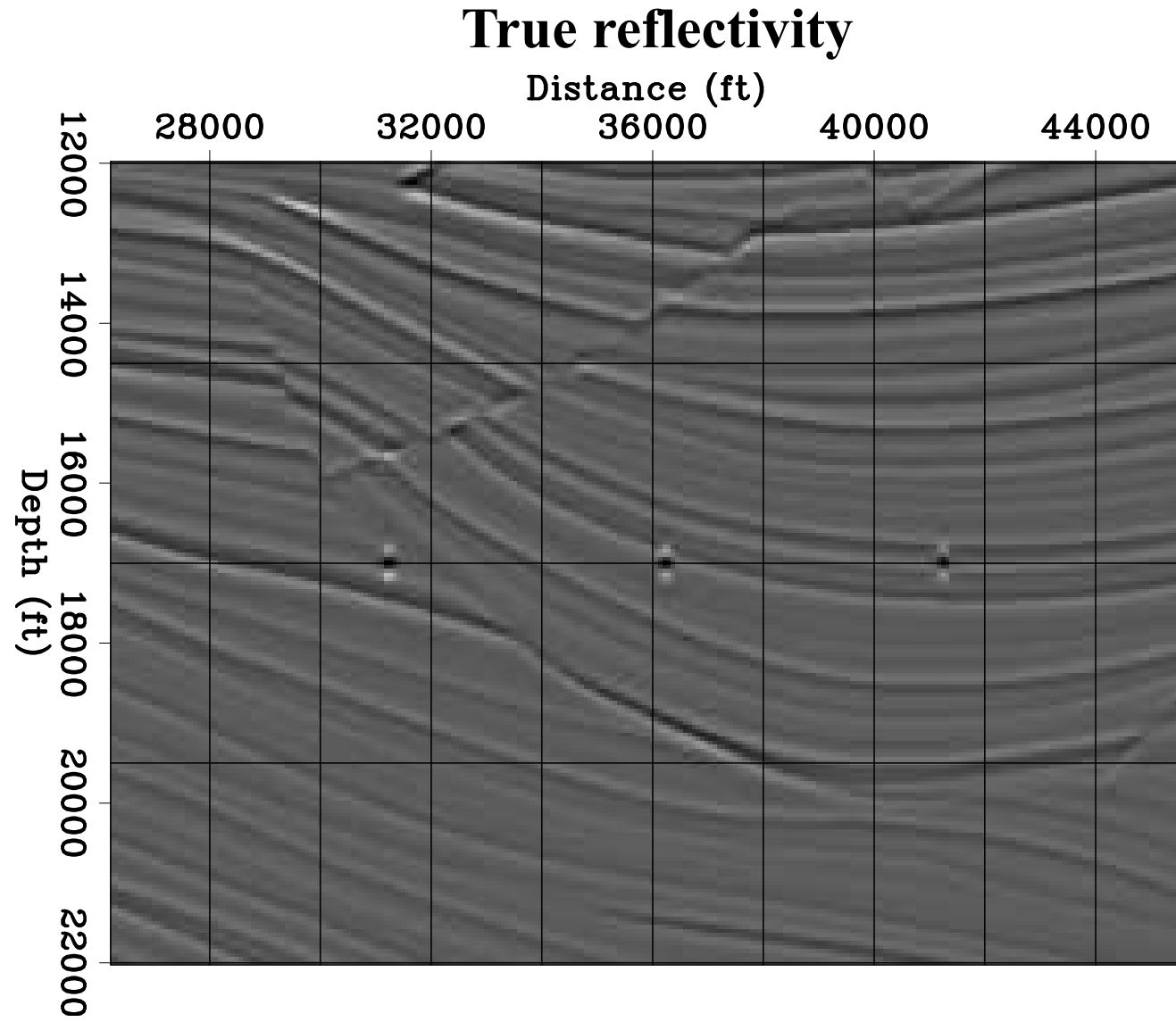


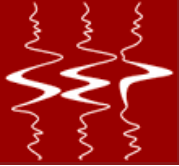
# 2D NUMERICAL RESULTS





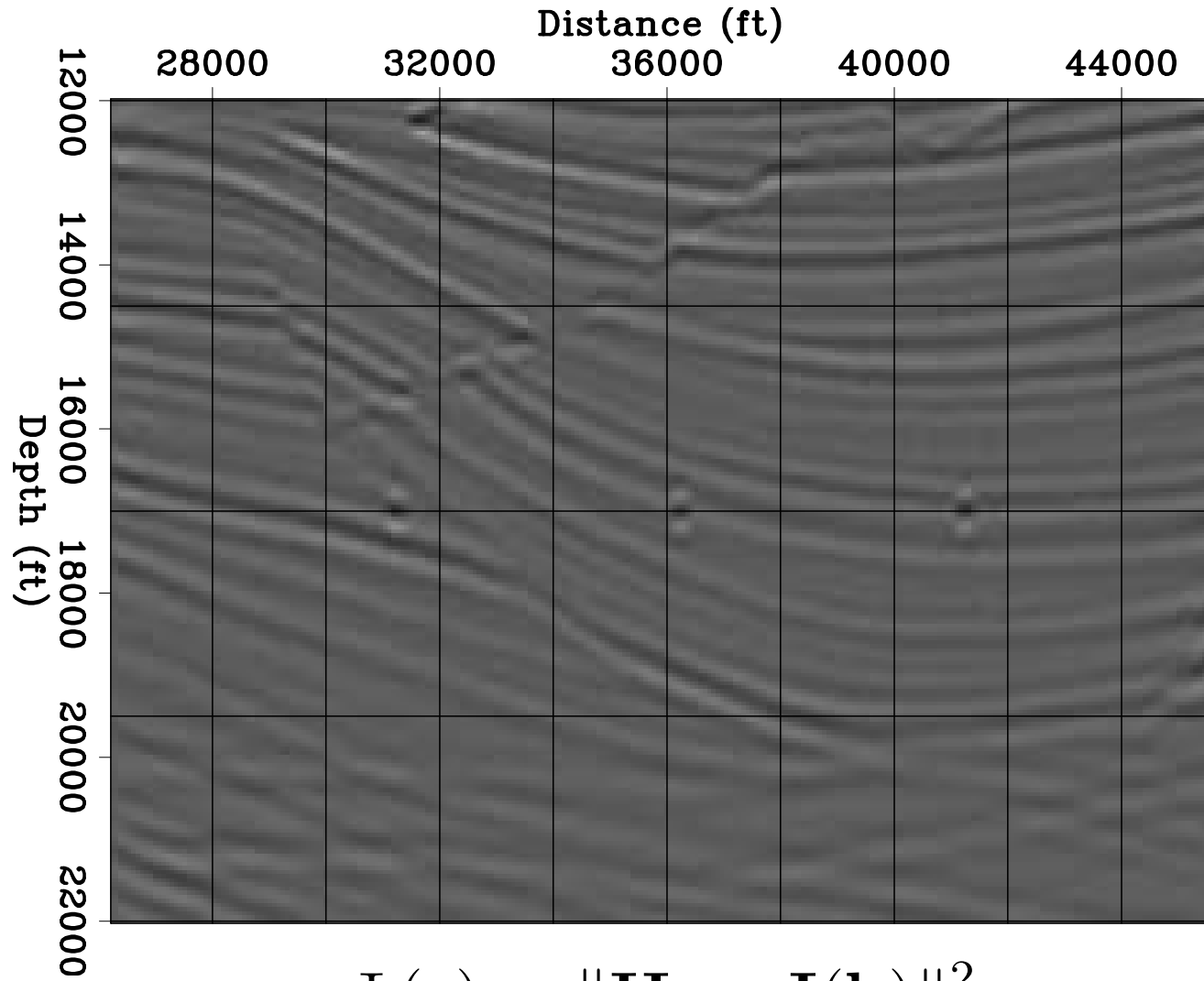
# 2D NUMERICAL RESULTS





# 2D NUMERICAL RESULTS

## LWI: True background model (b)

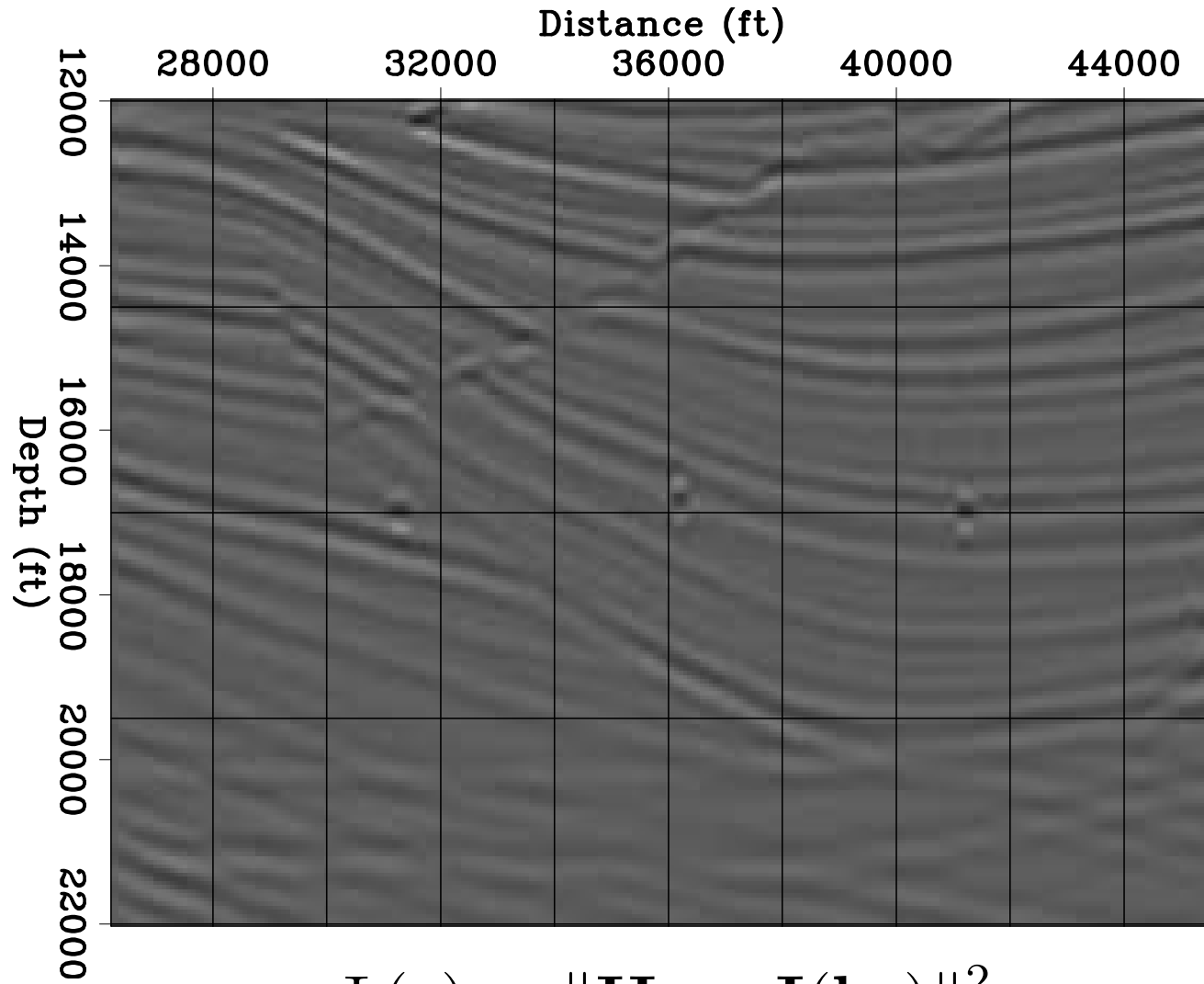


$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2$$

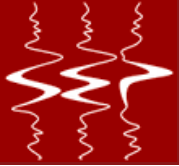


# 2D NUMERICAL RESULTS

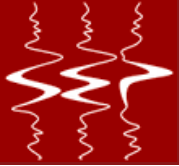
## LWI: Wrong background model ( $\mathbf{b}_0$ )



$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b}_0)\|_2^2$$

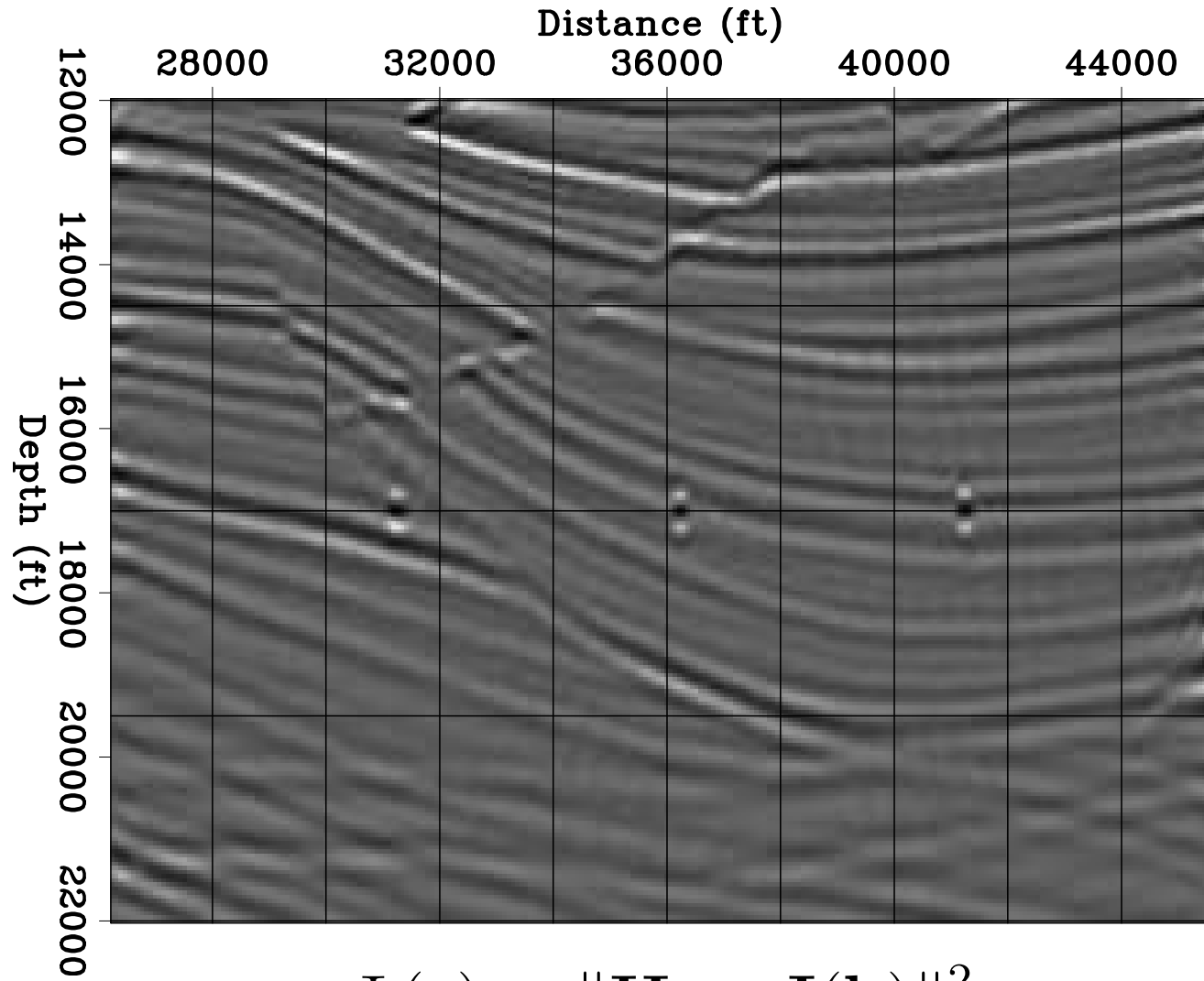


# Reflectivity model: LWI vs. JIRB

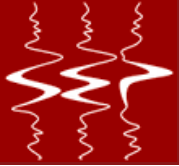


# 2D NUMERICAL RESULTS

## LWI: True background model (b)

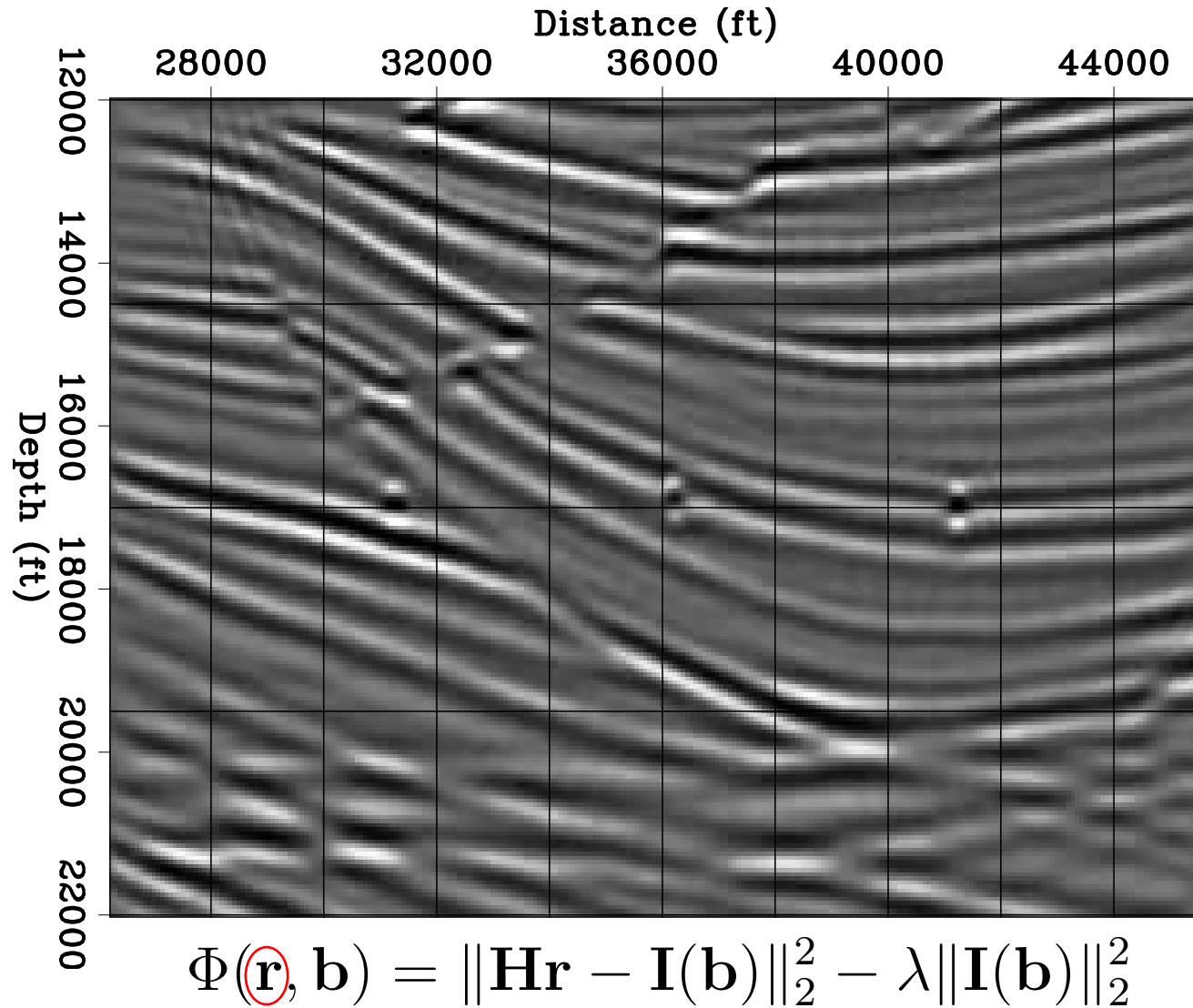


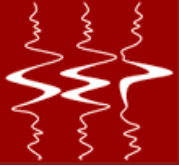
$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2$$



# 2D NUMERICAL RESULTS

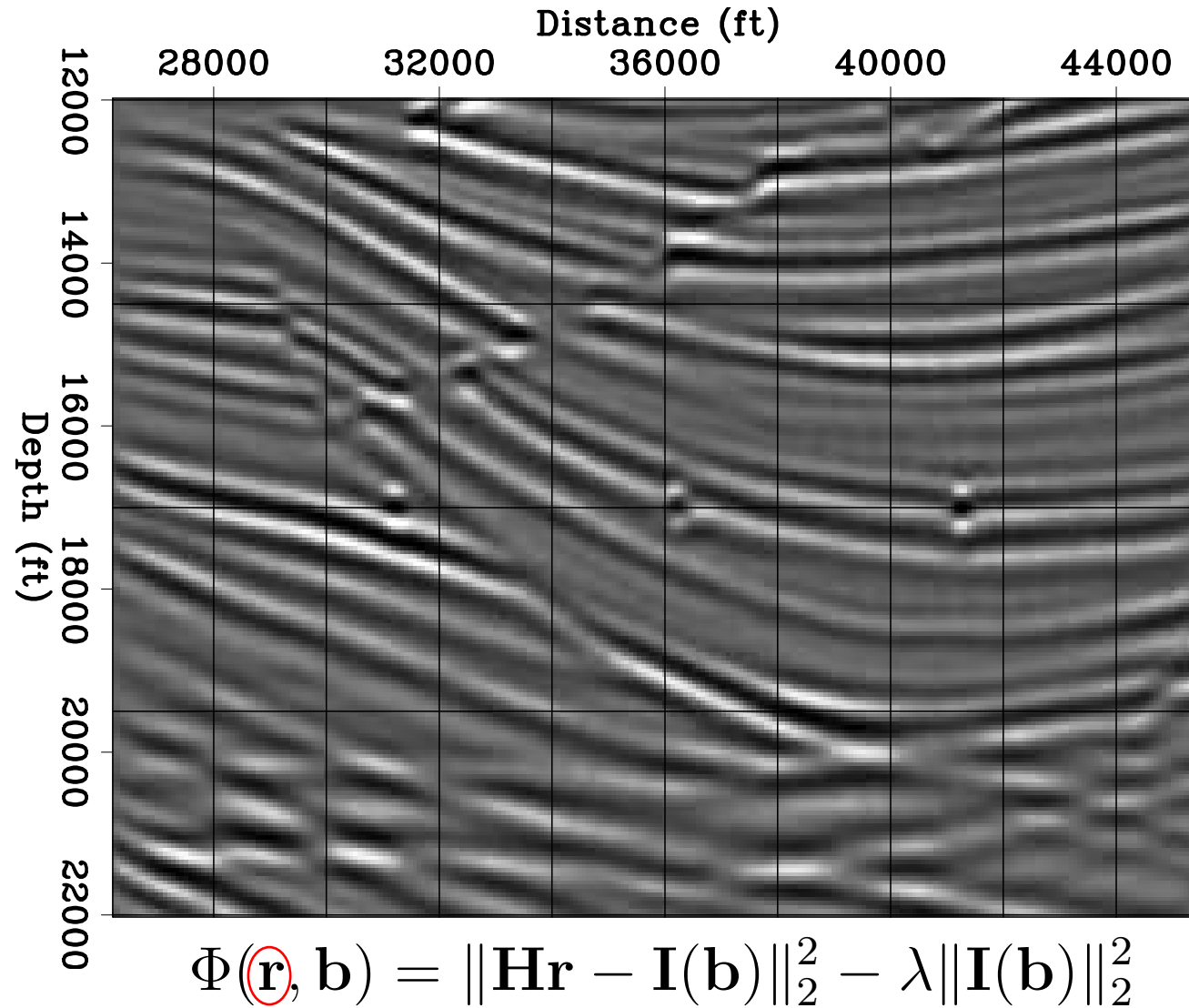
**JIRB:  $\lambda = 5$  (40 iterations\*)**





# 2D NUMERICAL RESULTS

**JIRB:  $\lambda = 10$  (30 iterations)**

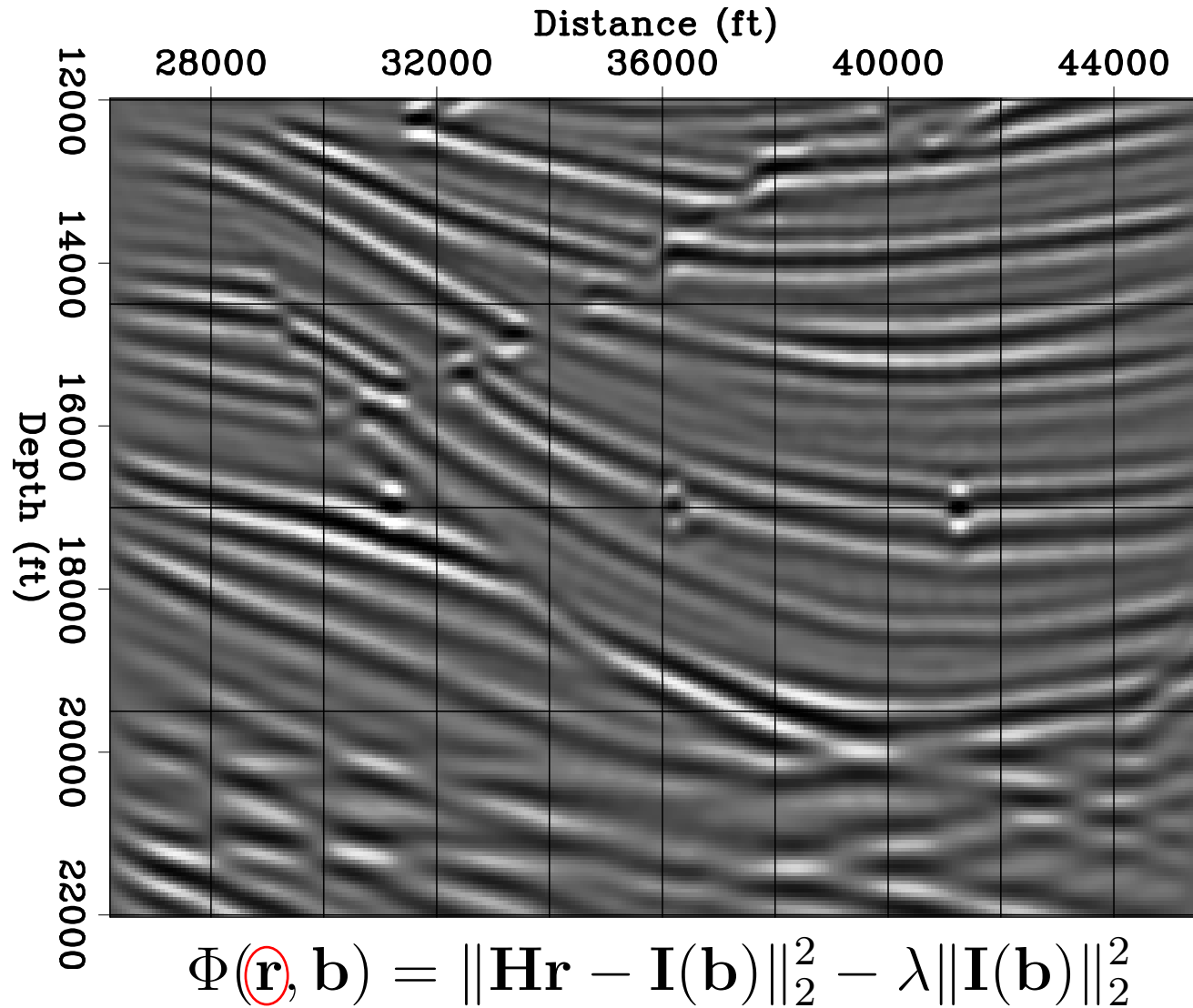


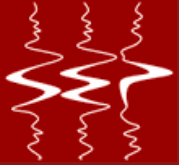




# 2D NUMERICAL RESULTS

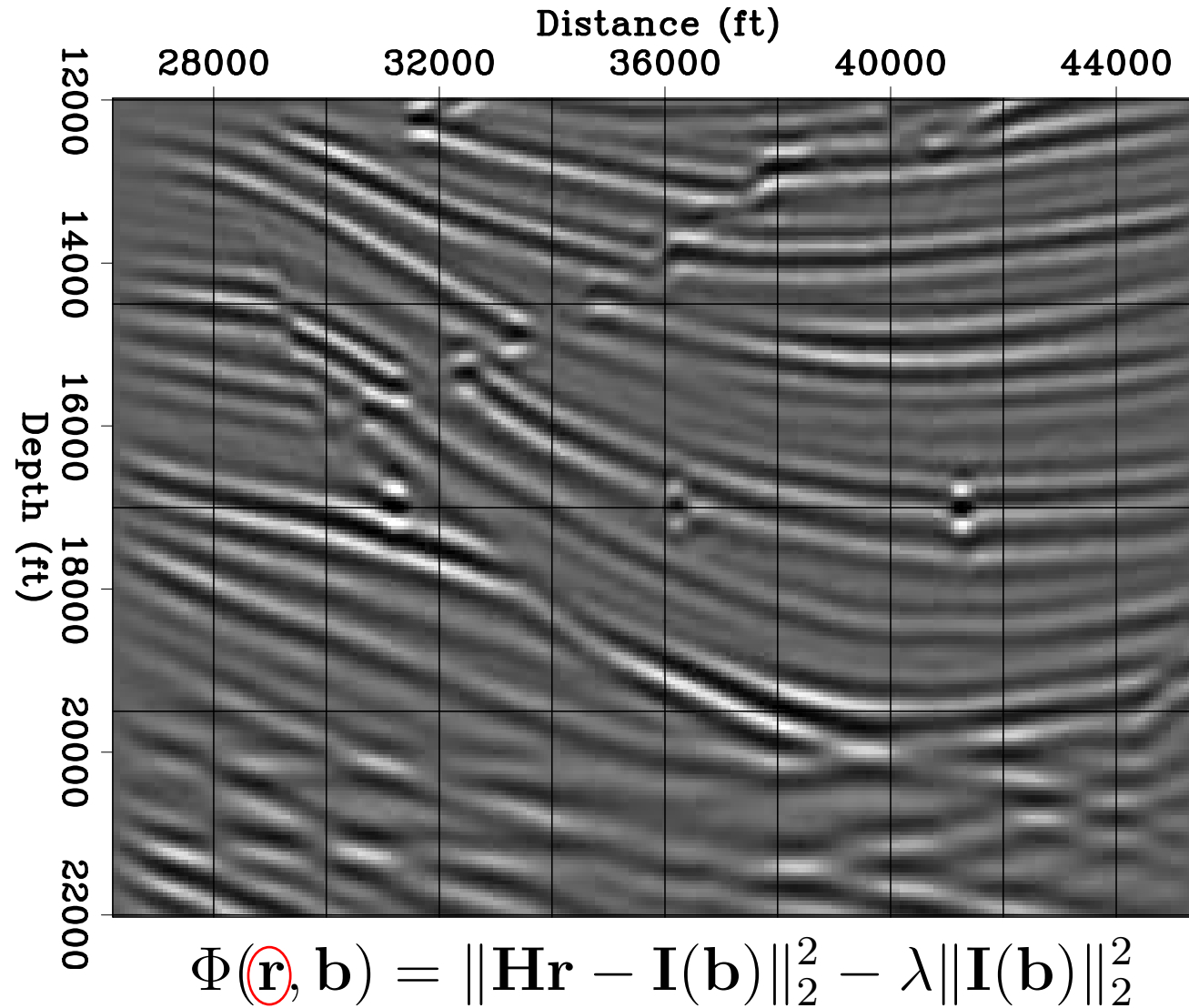
**JIRB:  $\lambda = 15$  (10 iterations)**

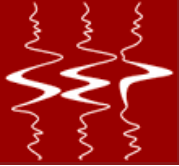




# 2D NUMERICAL RESULTS

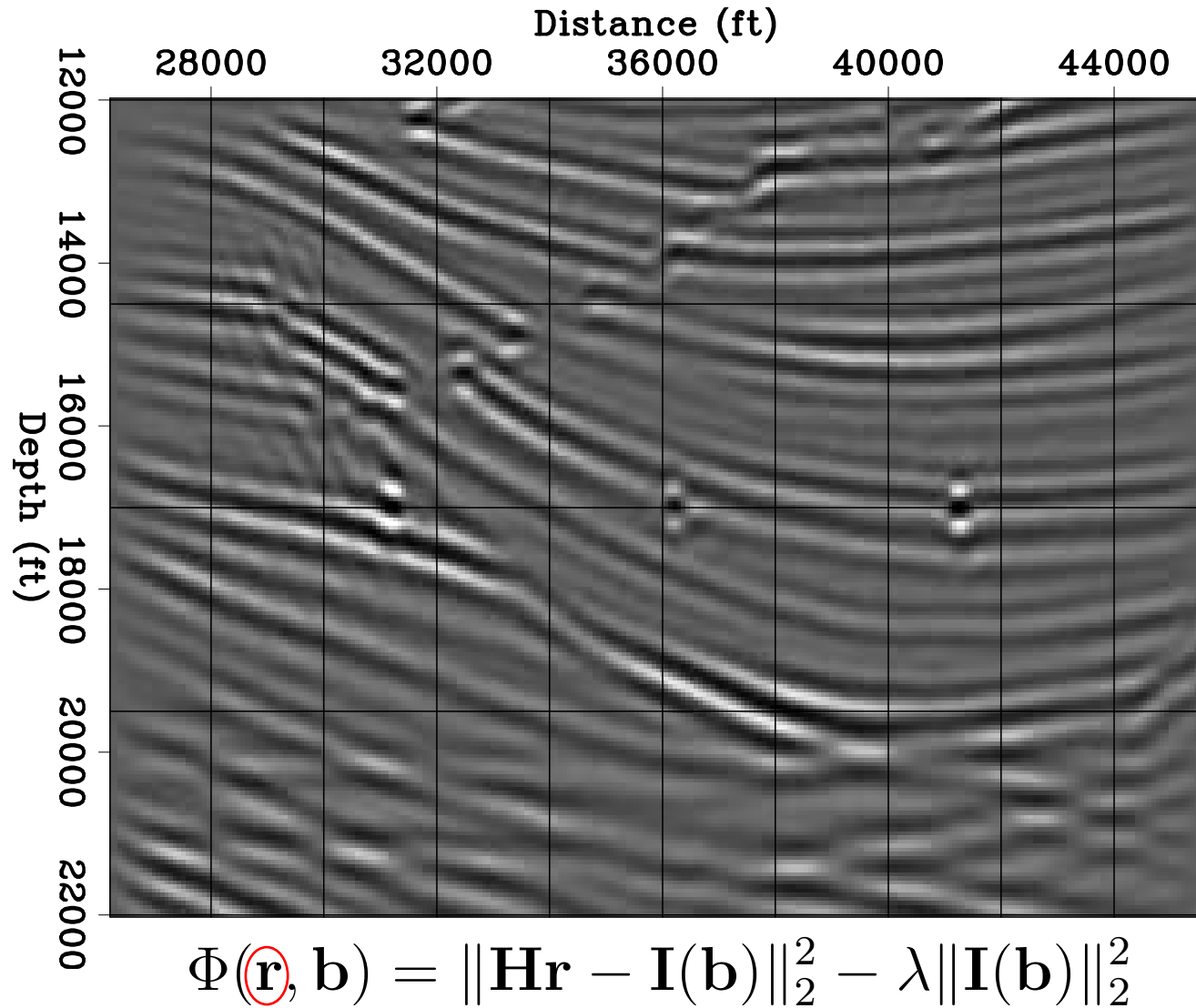
**JIRB:  $\lambda = 20$  (4 iterations)**





# 2D NUMERICAL RESULTS

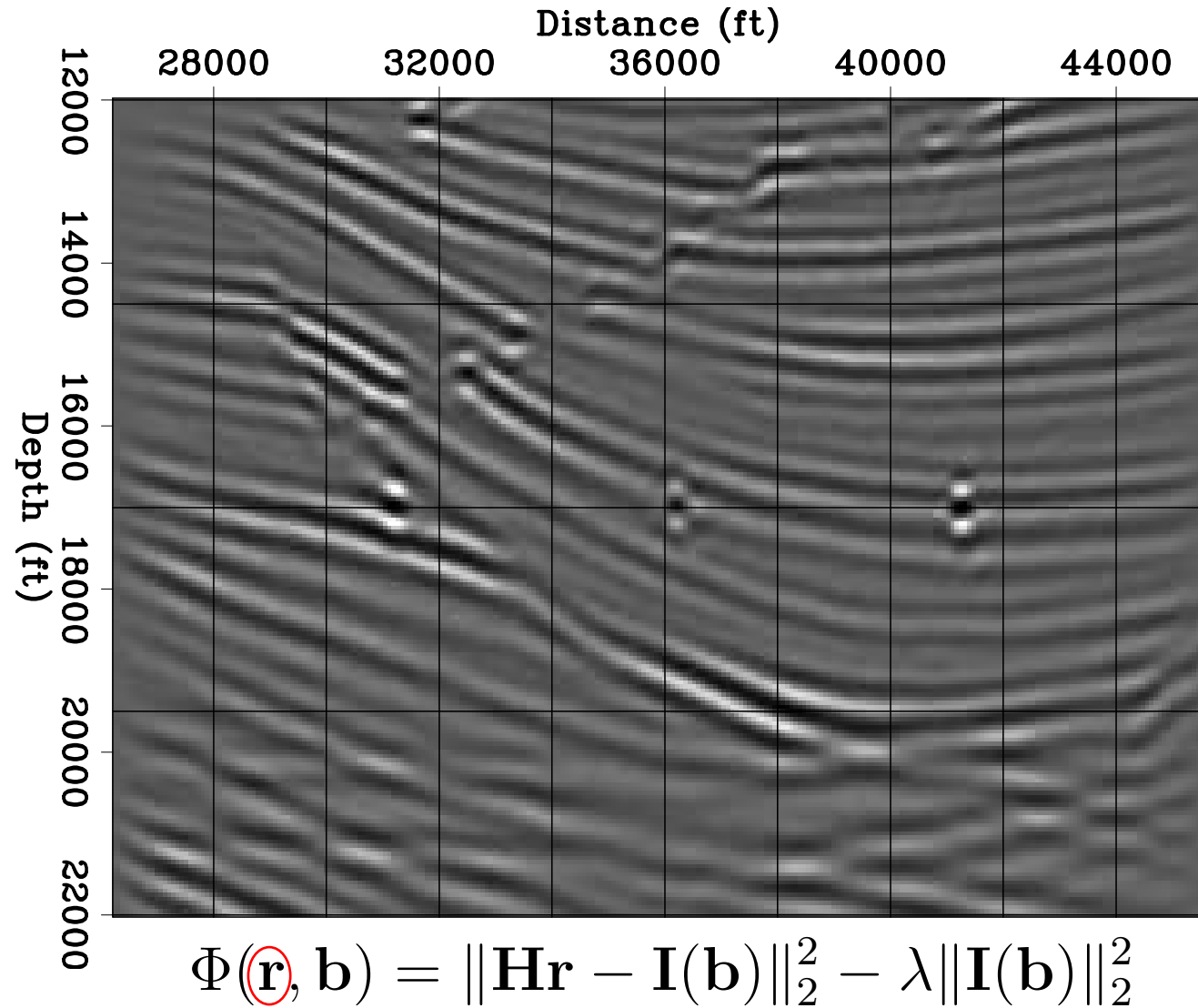
**JIRB:  $\lambda = 25$  (3 iterations)**

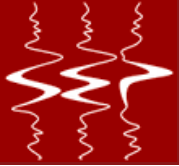




# 2D NUMERICAL RESULTS

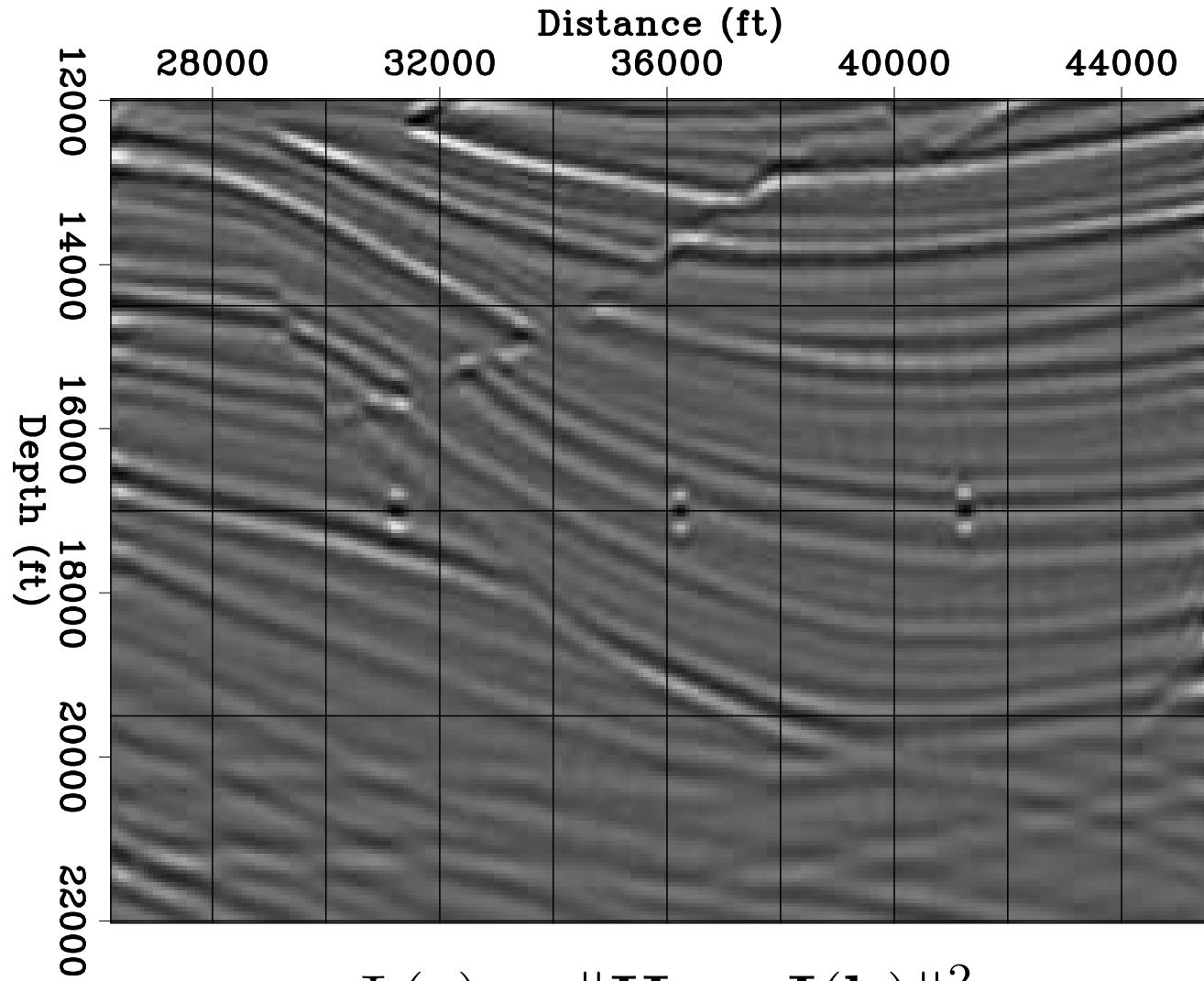
**JIRB:  $\lambda = 30$  (3 iterations)**



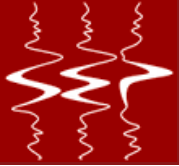


# 2D NUMERICAL RESULTS

## LWI: True background model (b)

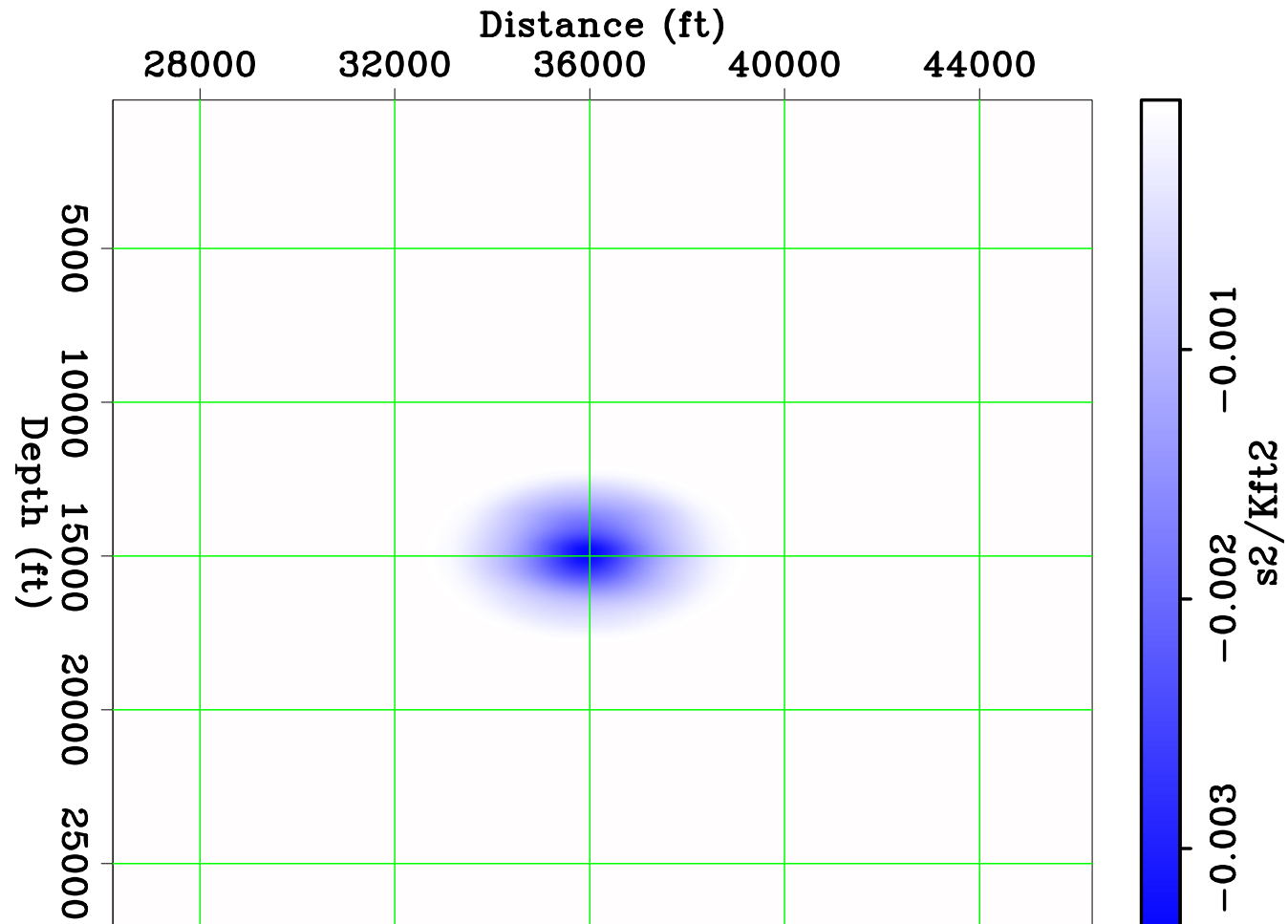


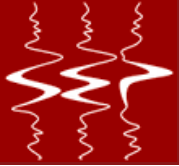
$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2$$



# NUMERICAL RESULTS

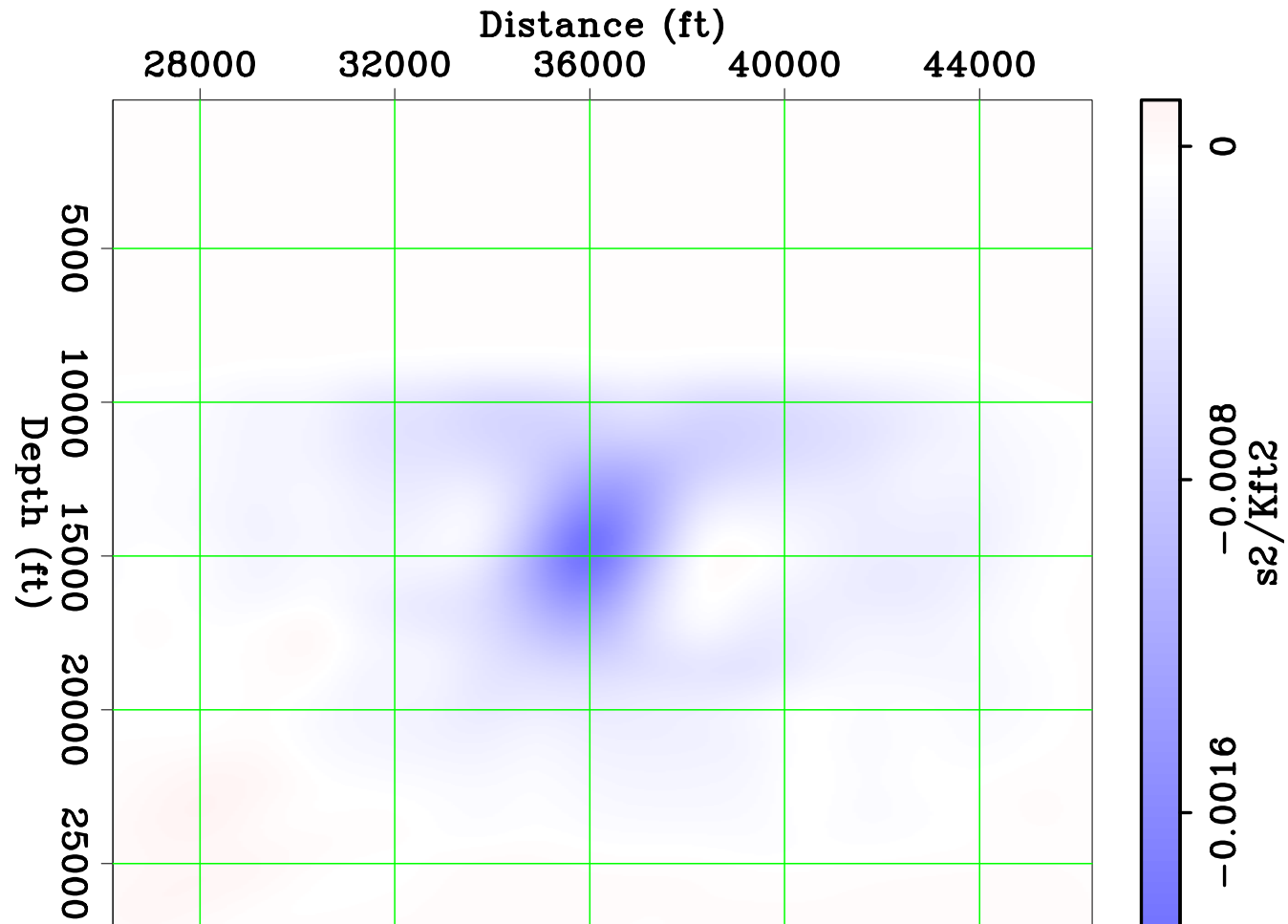
## True perturbation in the background



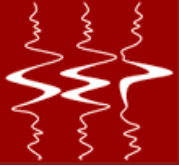


# NUMERICAL RESULTS

## JIRB perturbation in the background ( $\lambda = 25$ )



$$\Phi(\mathbf{r}, \mathbf{b}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2 - \lambda \|\mathbf{I}(\mathbf{b})\|_2^2$$



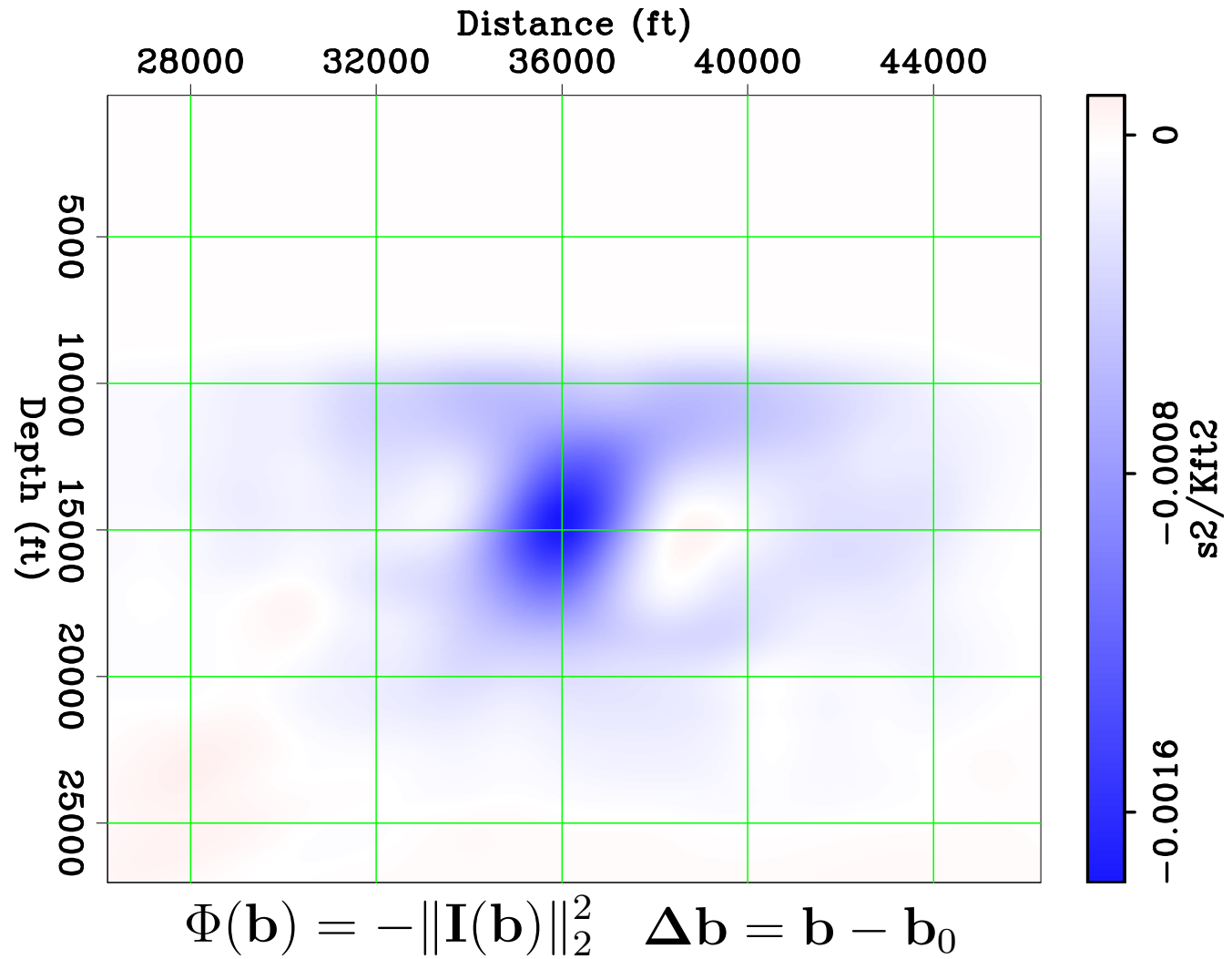
Background model:  
WEMVA vs. JIRB

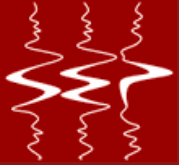




# 2D NUMERICAL RESULTS

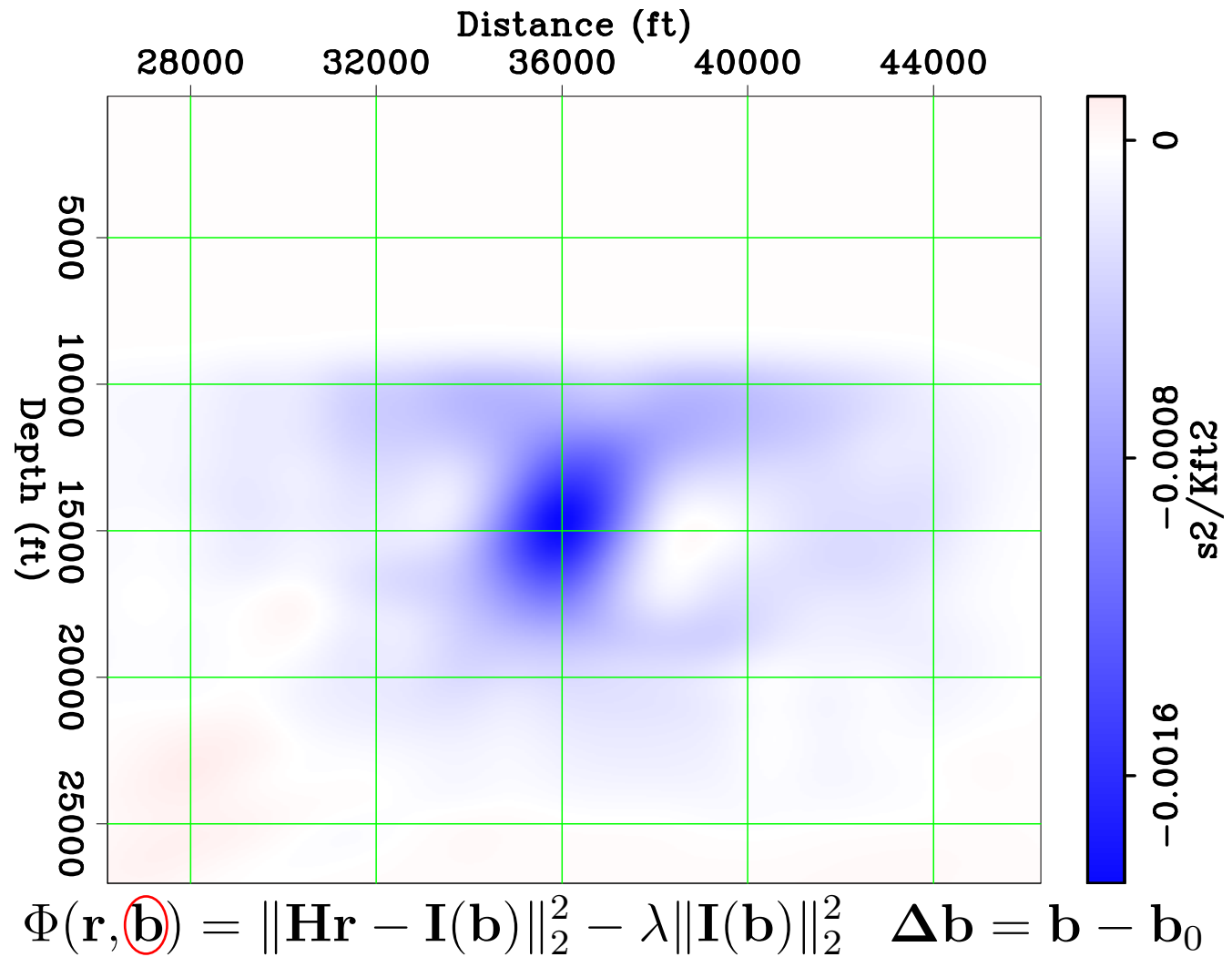
## WEMVA perturbation in the background

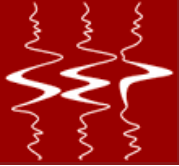




# 2D NUMERICAL RESULTS

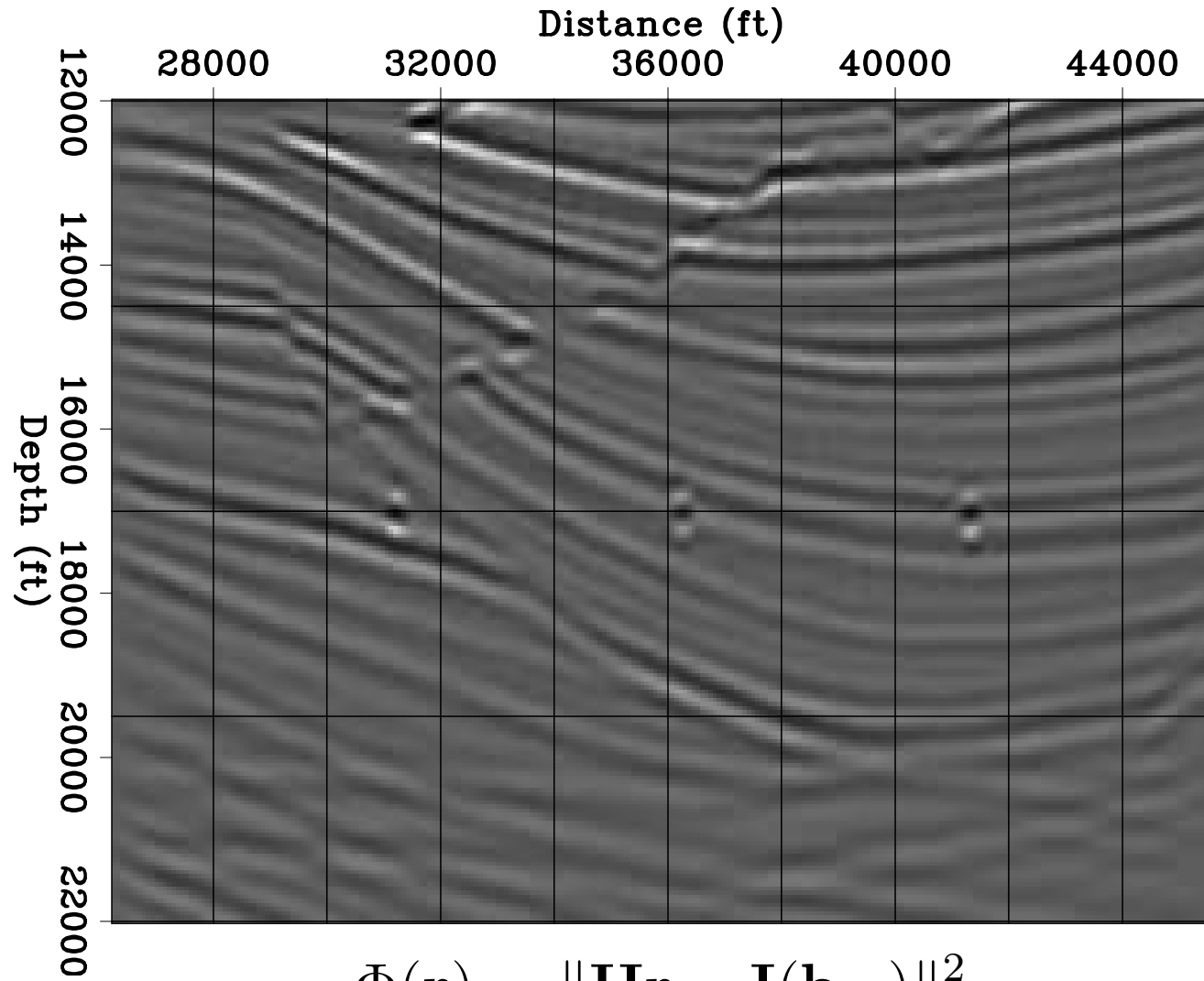
## JIRB perturbation in the background ( $\lambda = 25$ )





# 2D NUMERICAL RESULTS

## LWI with WEMVA background model

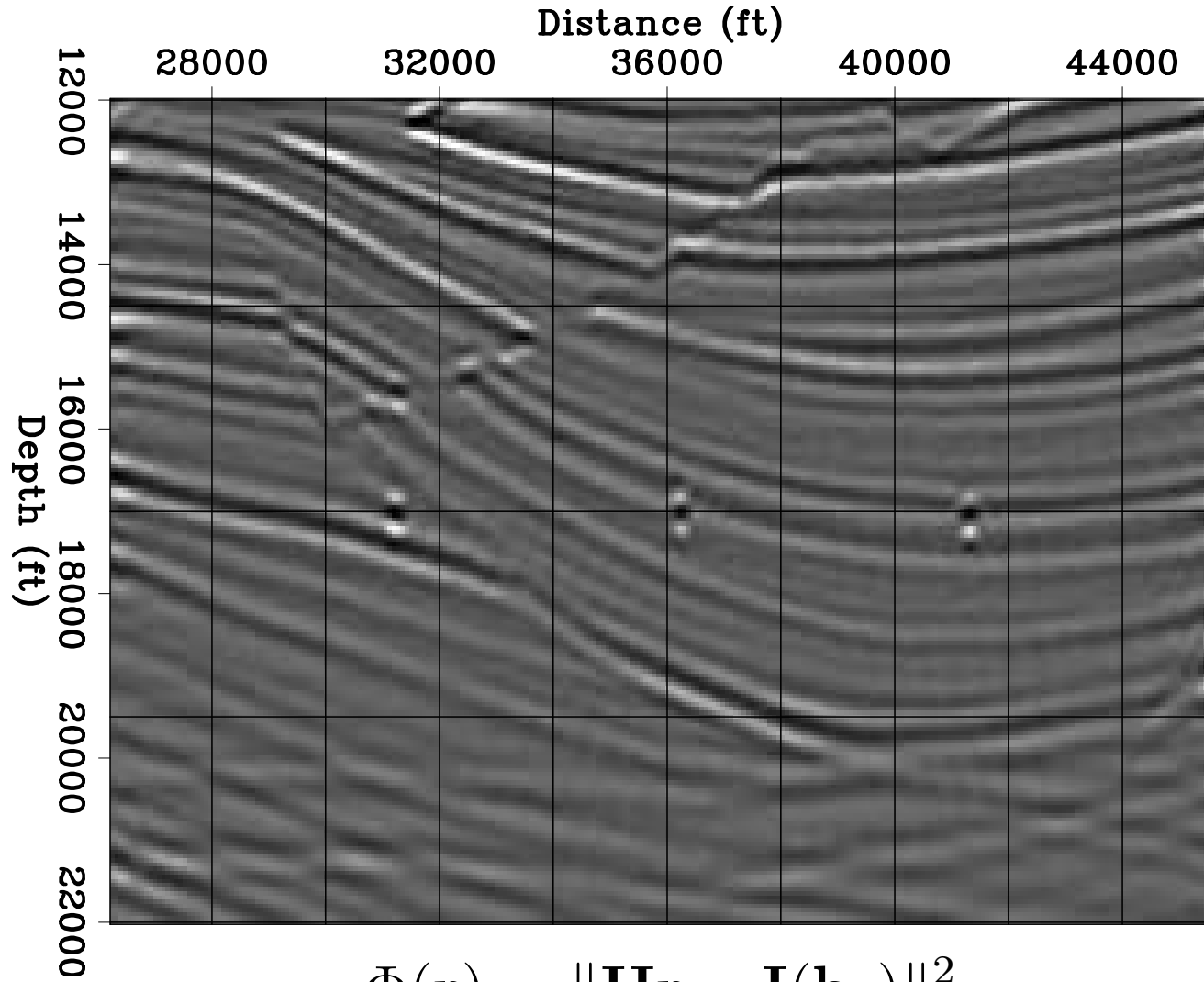


$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b}_W)\|_2^2$$

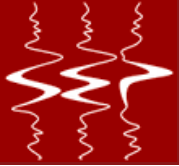


# 2D NUMERICAL RESULTS

## LWI with JIRB background model



$$\Phi(\mathbf{r}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b}_J)\|_2^2$$



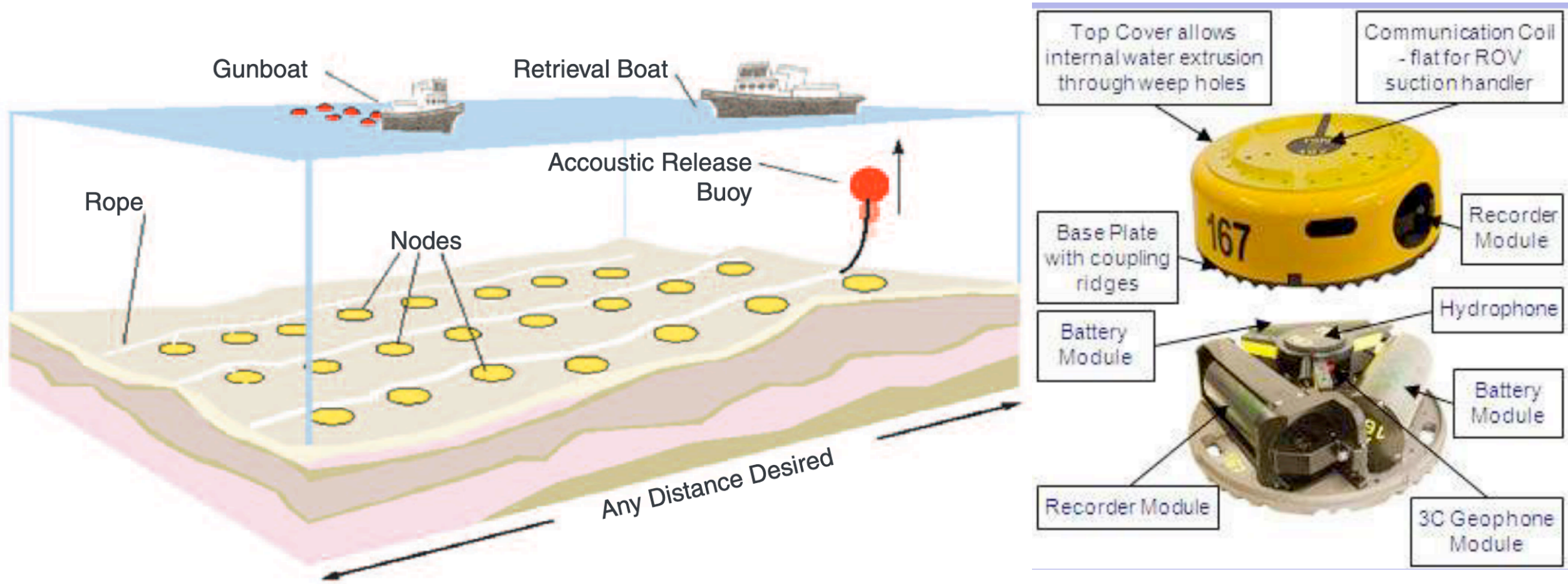
# 3D NUMERICAL TESTS





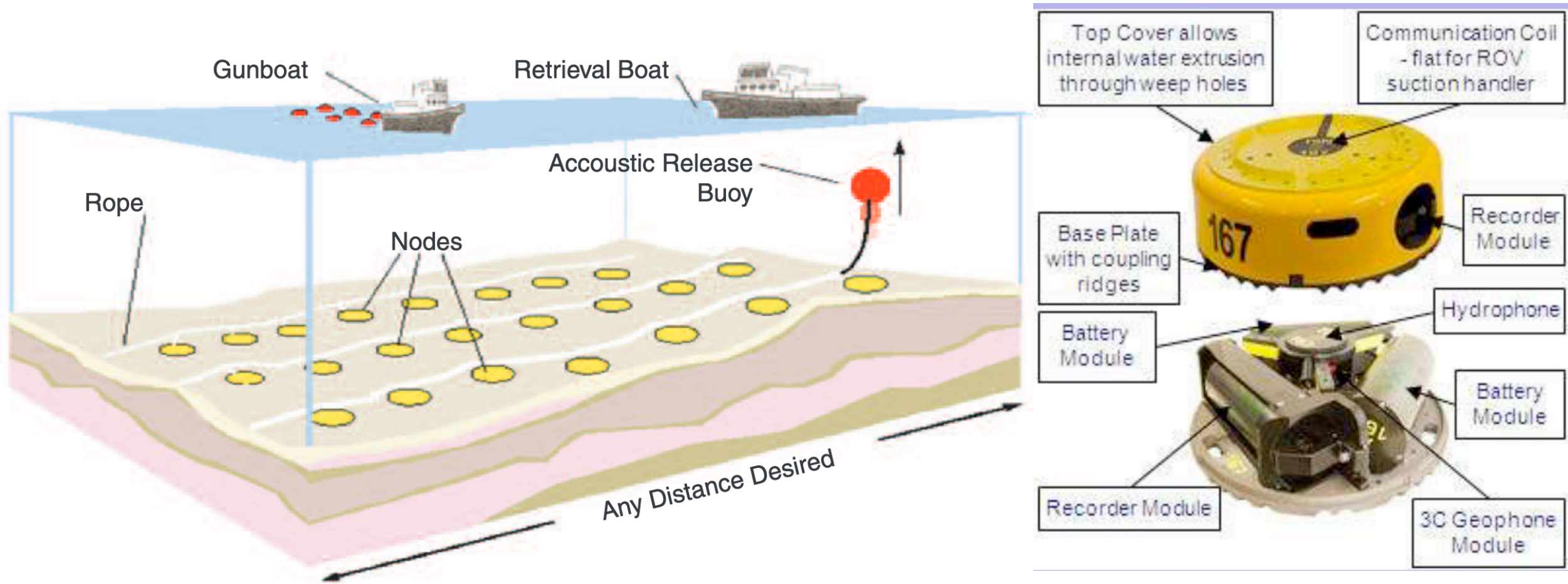
# 3D NUMERICAL RESULTS

## 3D real data test: Ocean Bottom Node (OBN)

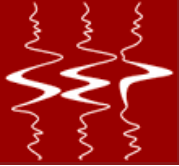


# 3D NUMERICAL RESULTS

## 3D real data test: Ocean Bottom Node (OBN)

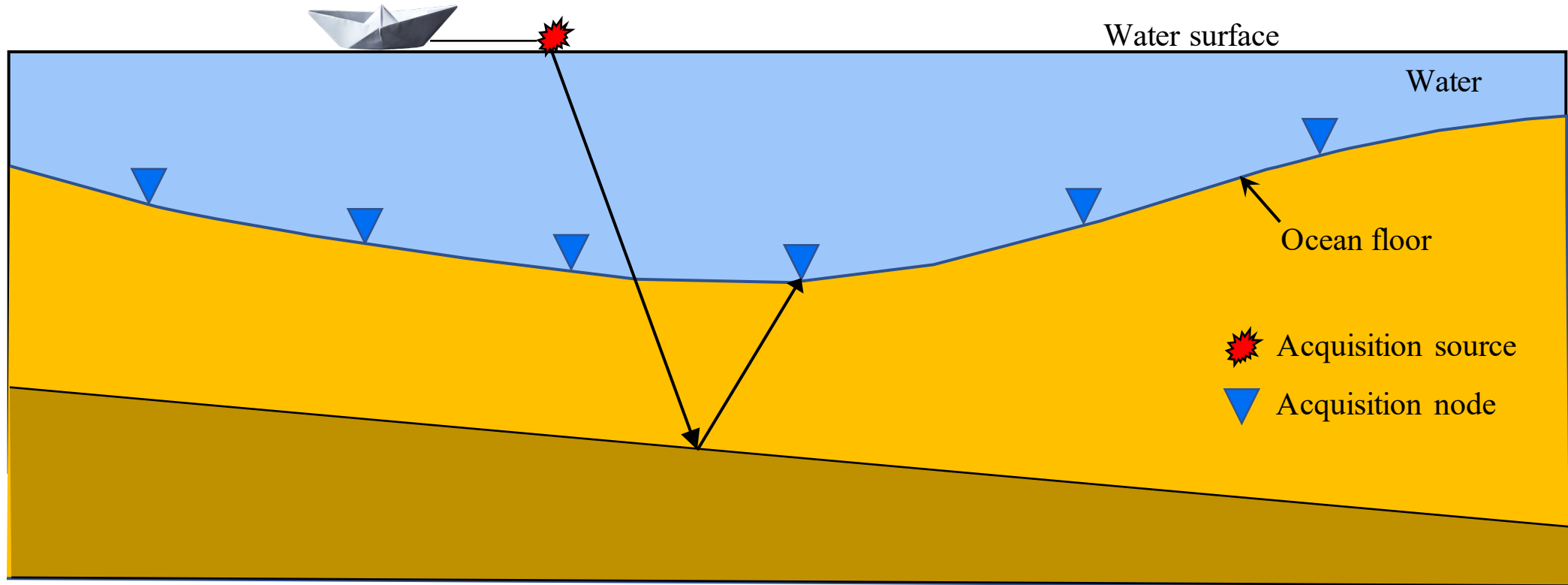


- Hydrophone: Measures pressure  $\Rightarrow$  Scalar
- Geophone: Measures Displacement  $\Rightarrow$  Vector



# 3D NUMERICAL RESULTS

## Upgoing component

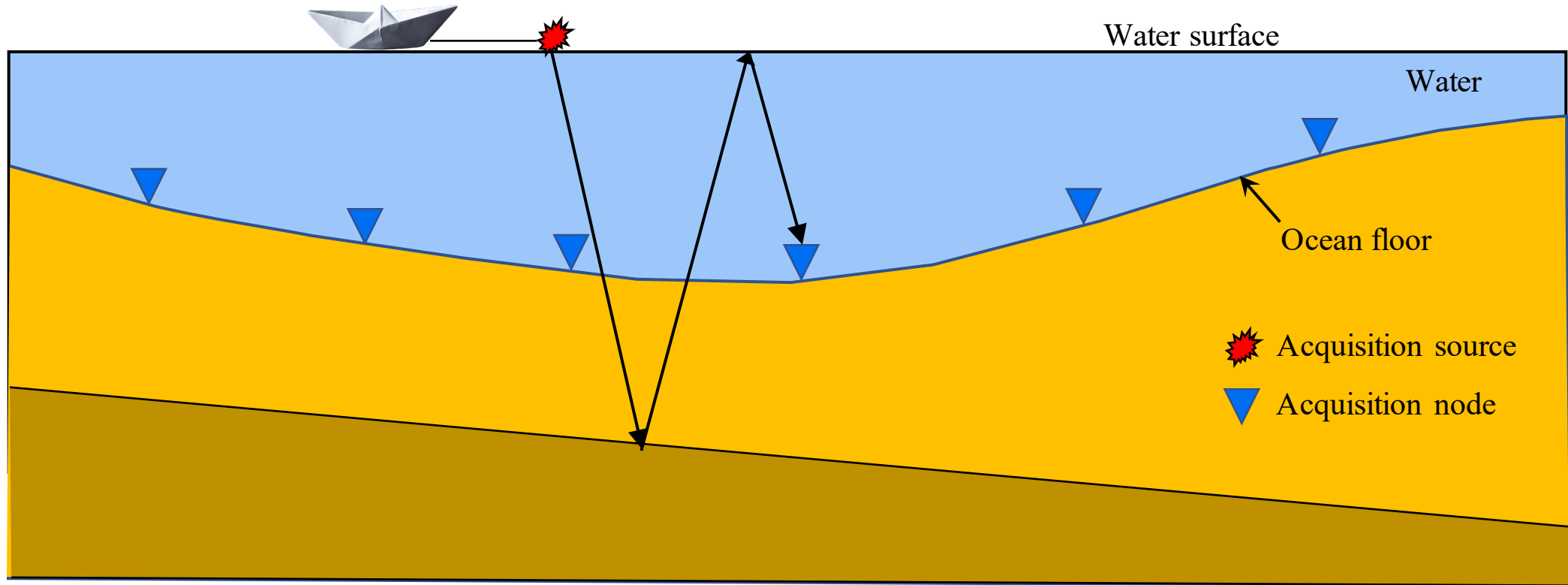


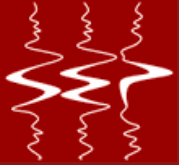




# 3D NUMERICAL RESULTS

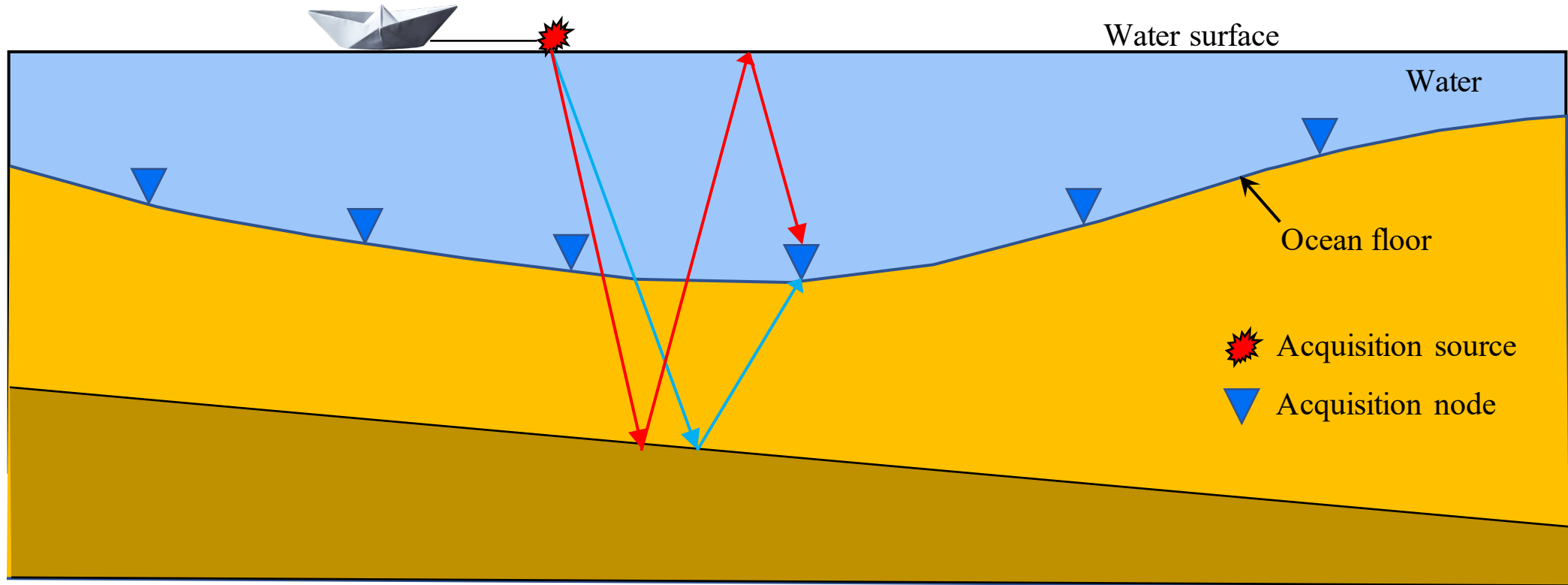
## Downgoing component



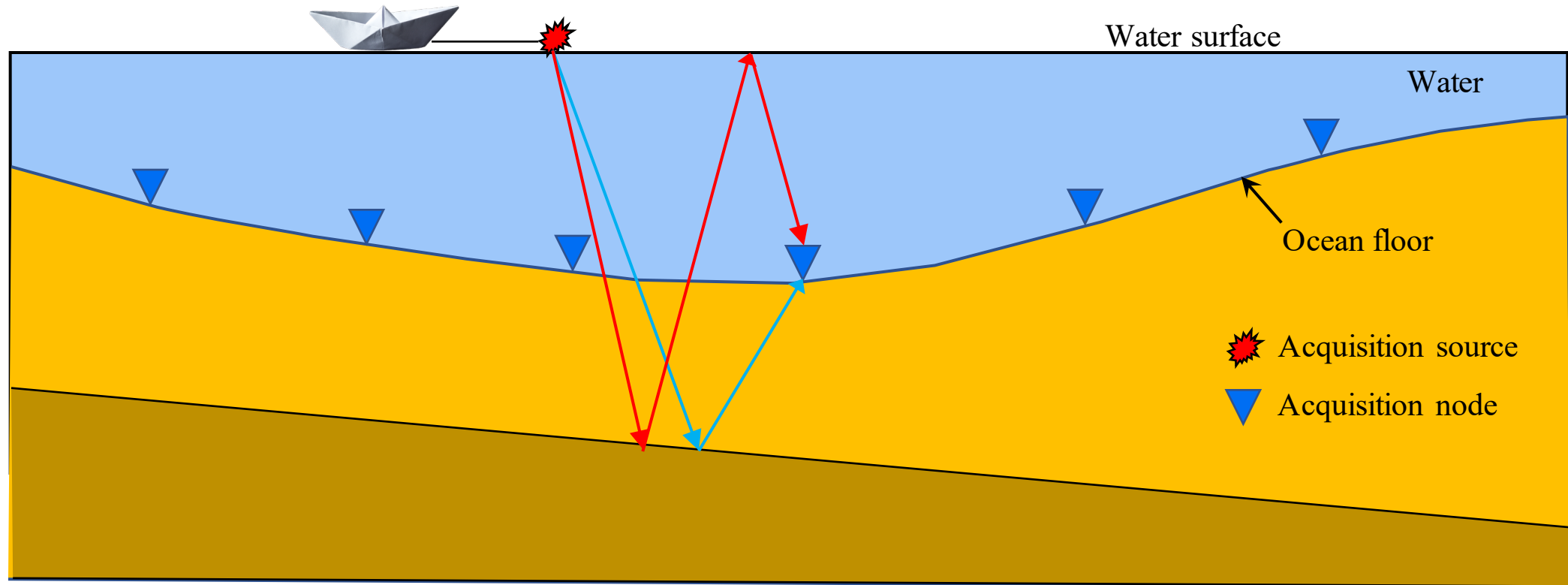


# 3D NUMERICAL RESULTS

## Upgoing and downgoing components



## Upgoing and downgoing components

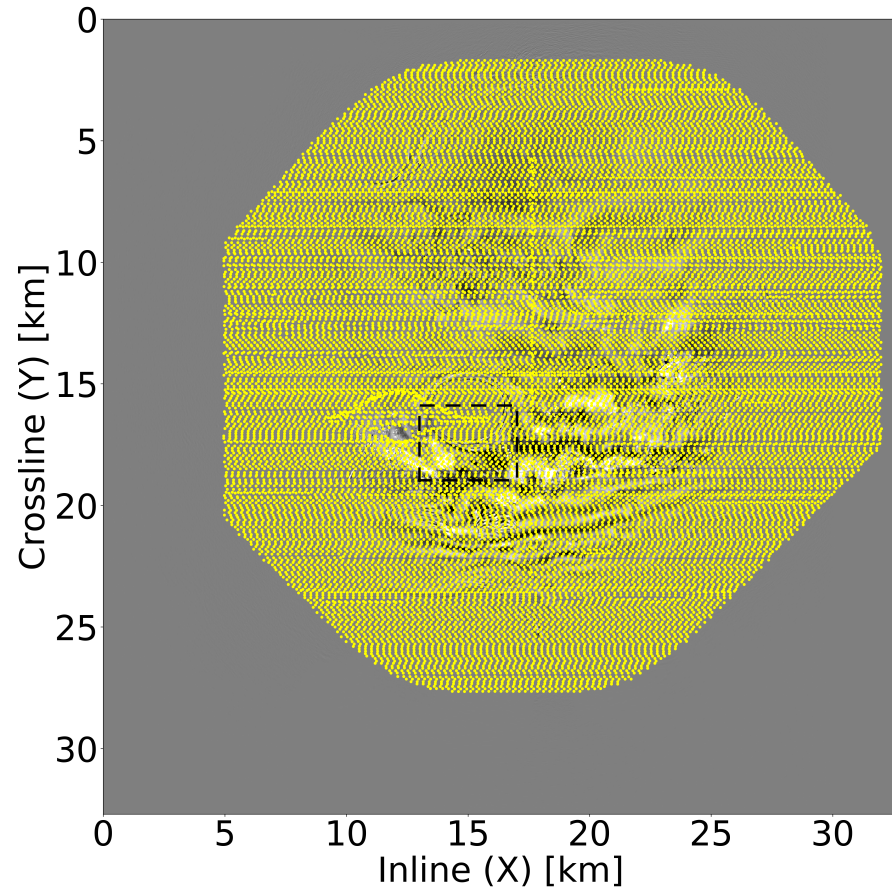


**We separate components using PZ-summation!**

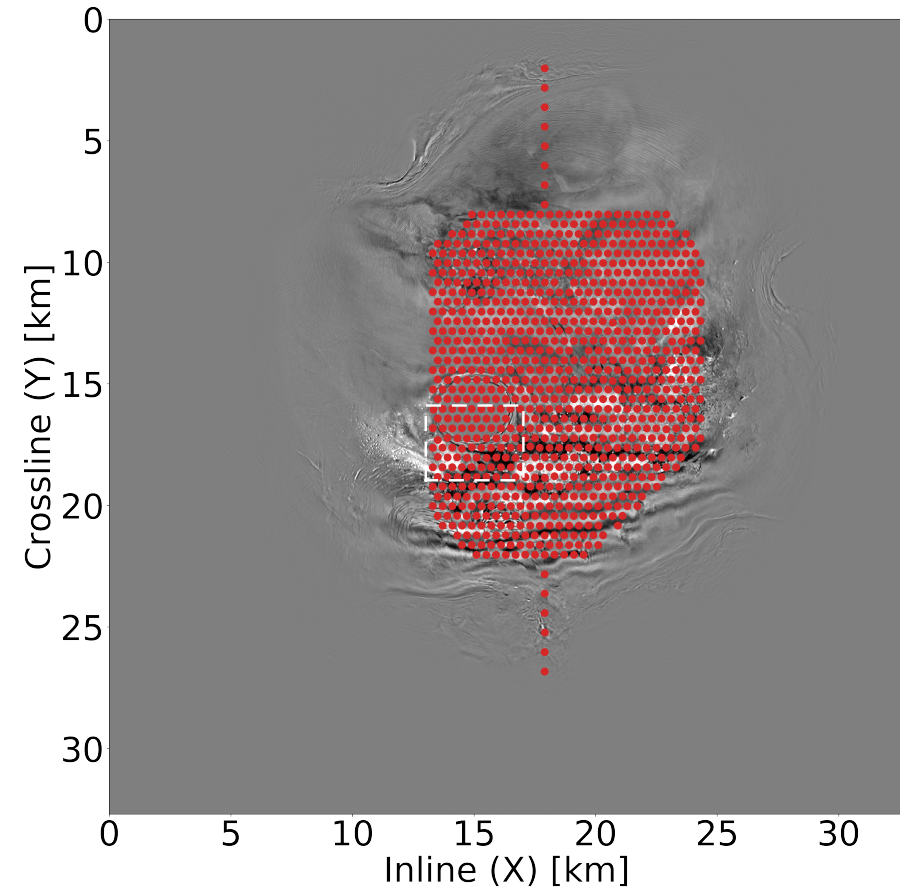


# 3D NUMERICAL RESULTS

## Shell 3D dataset (Gulf of Mexico)

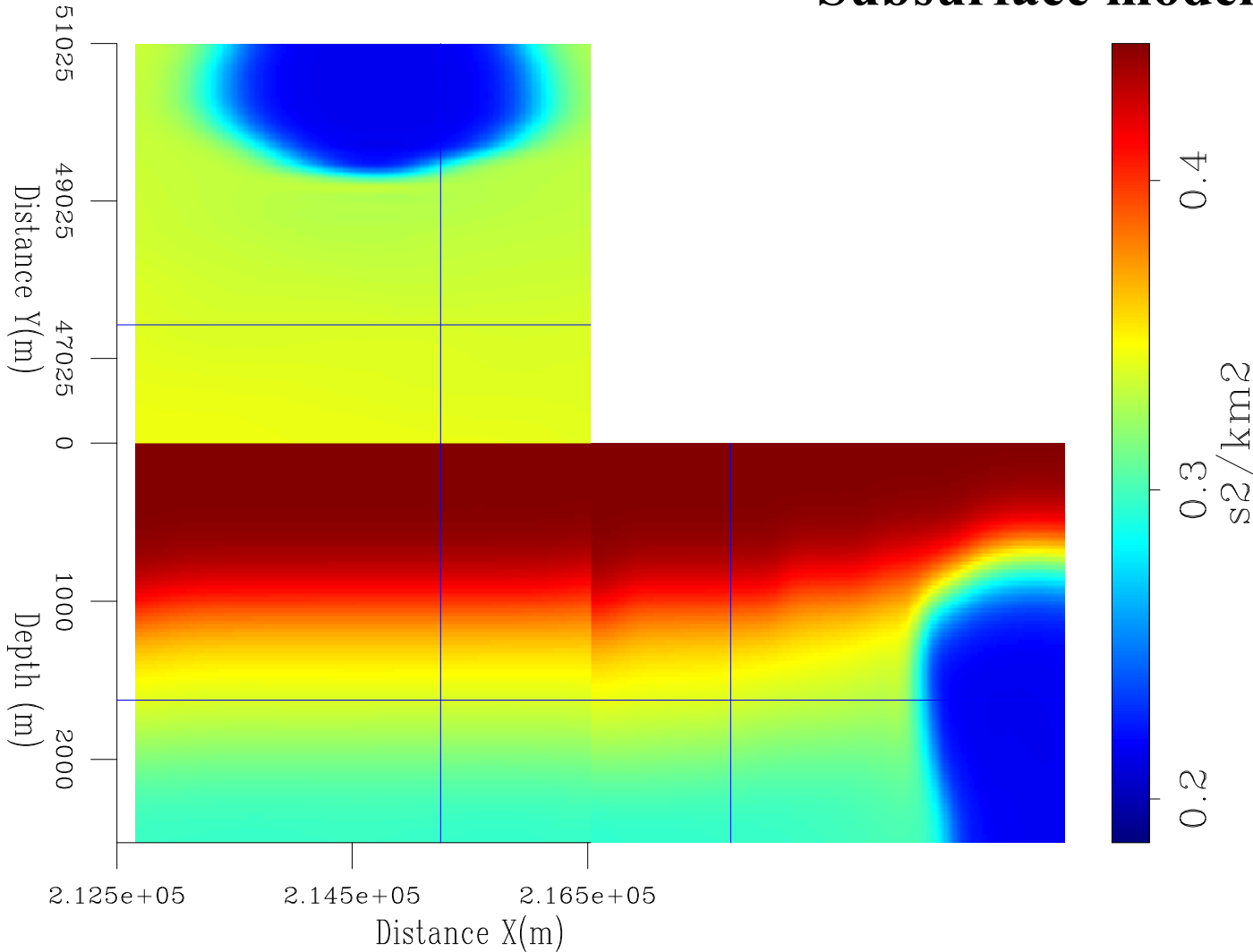


**Sources**



**Nodes**

## Subsurface model and data



Subsurface model (slowness squared):

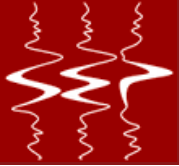
- Inline: 4000 m
- Crossline: 5050 m
- Vertical: 2500 m
- Spacing: 25 m
- Imaging aperture: 50 samples

Data:

- 226 nodes in the computational area
- Sorted in common-receiver gathers
- Binned to 25x25 m grid
- 539x441=237699 traces (include aperture)
- CRGs span the computational area
- Ricker wavelet, ~10.5 Hz dom. Frequency

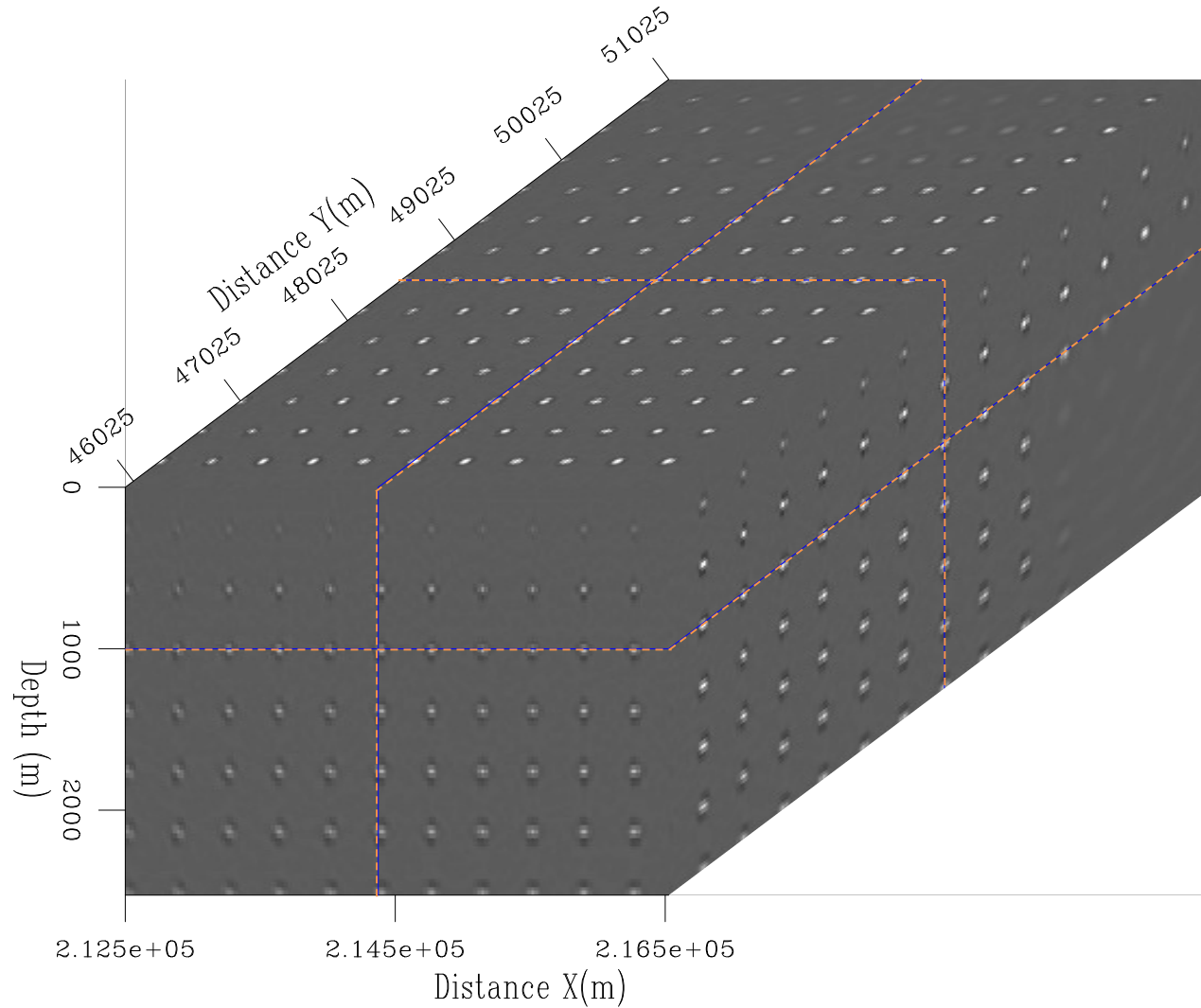
Imaging:

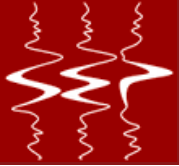
- Mirror imaging, using the downgoing component
- Inversions ran for 10 iterations (9 WEMVA)



# 3D NUMERICAL RESULTS

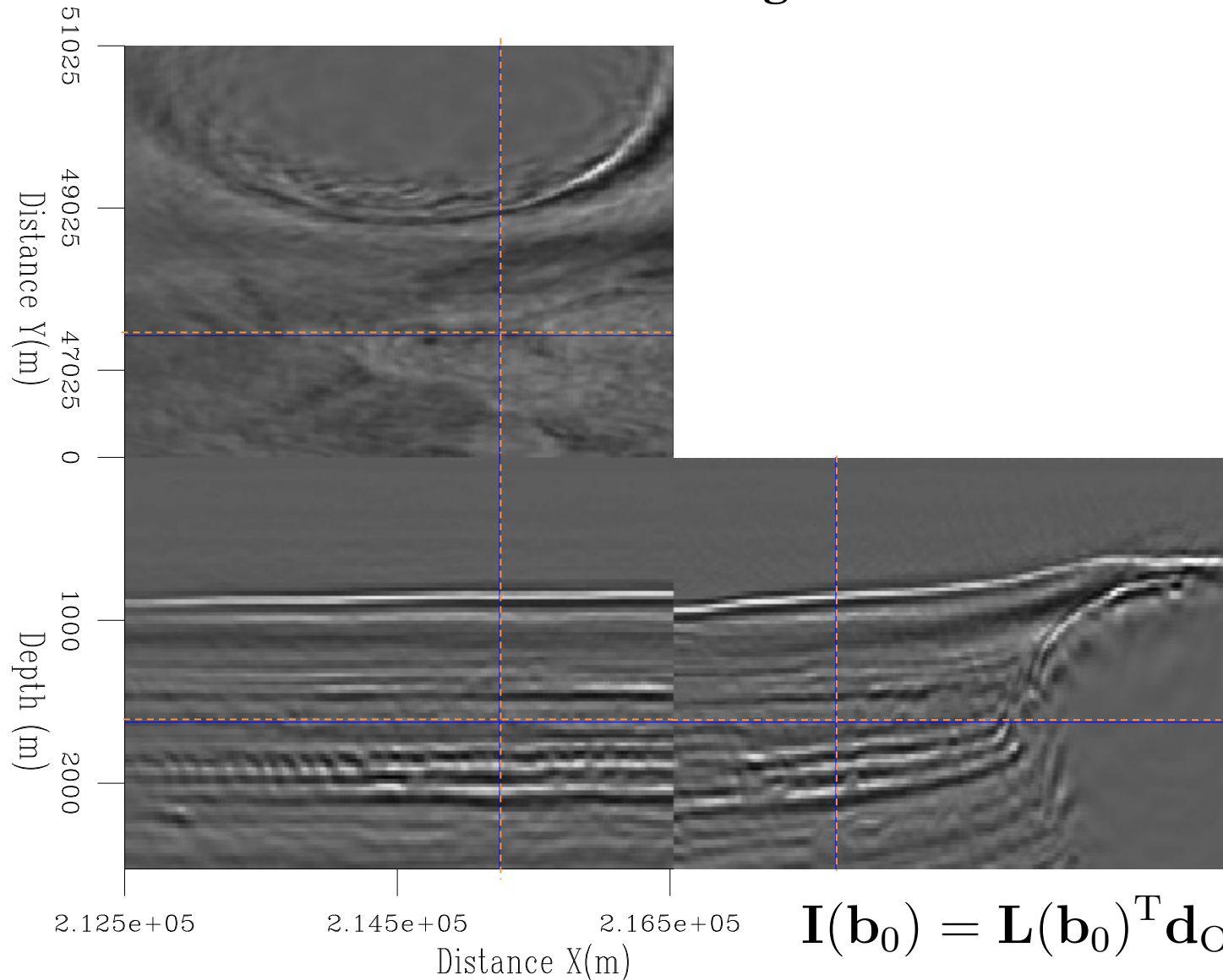
## Point-spread functions: Seeded every 15 gridpoints



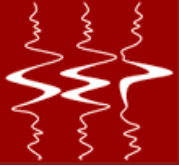


# 3D NUMERICAL RESULTS

## RTM image

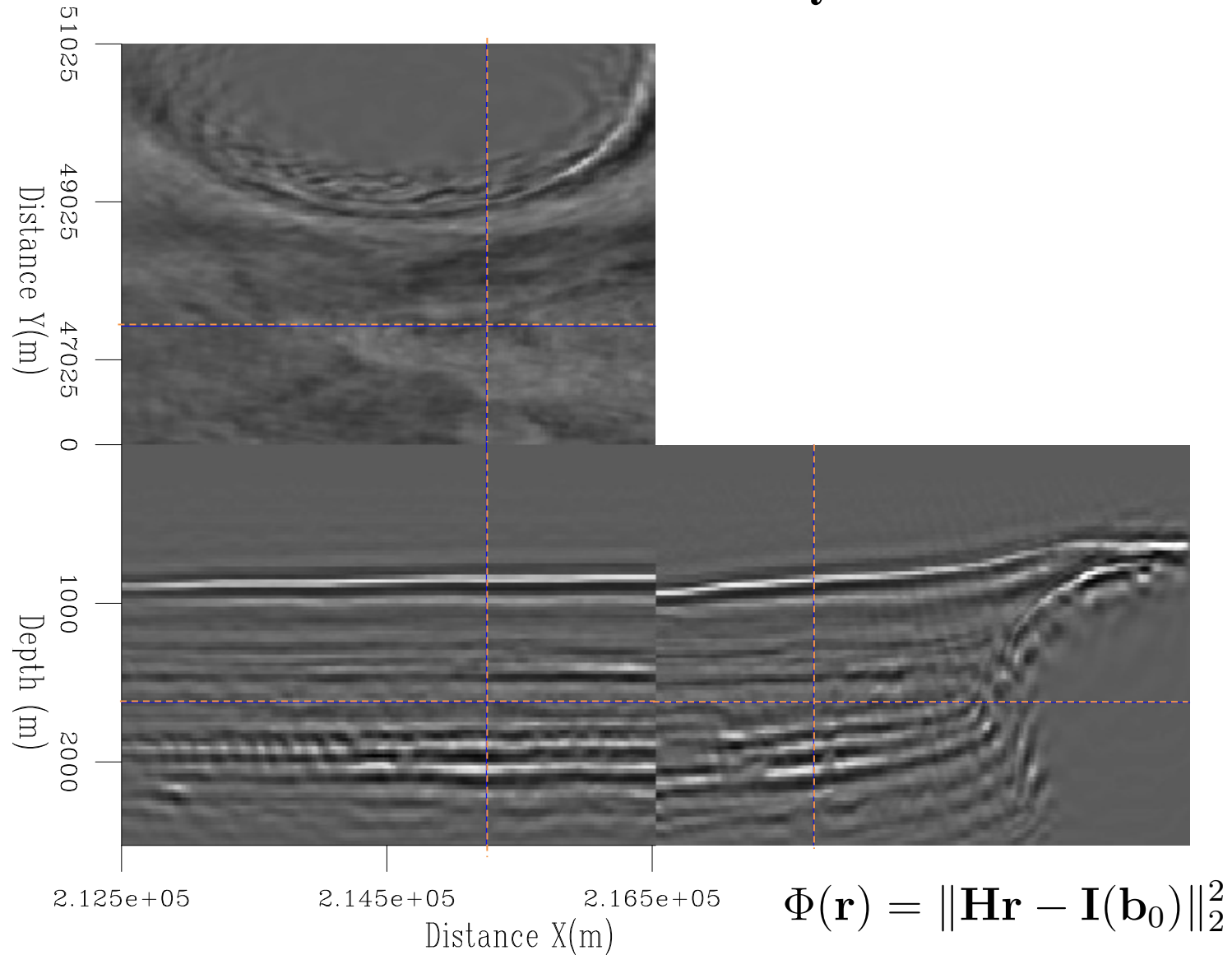


$$\mathbf{I}(\mathbf{b}_0) = \mathbf{L}(\mathbf{b}_0)^T \mathbf{d}_{\text{OBN}}$$



# 3D NUMERICAL RESULTS

## LWI reflectivity

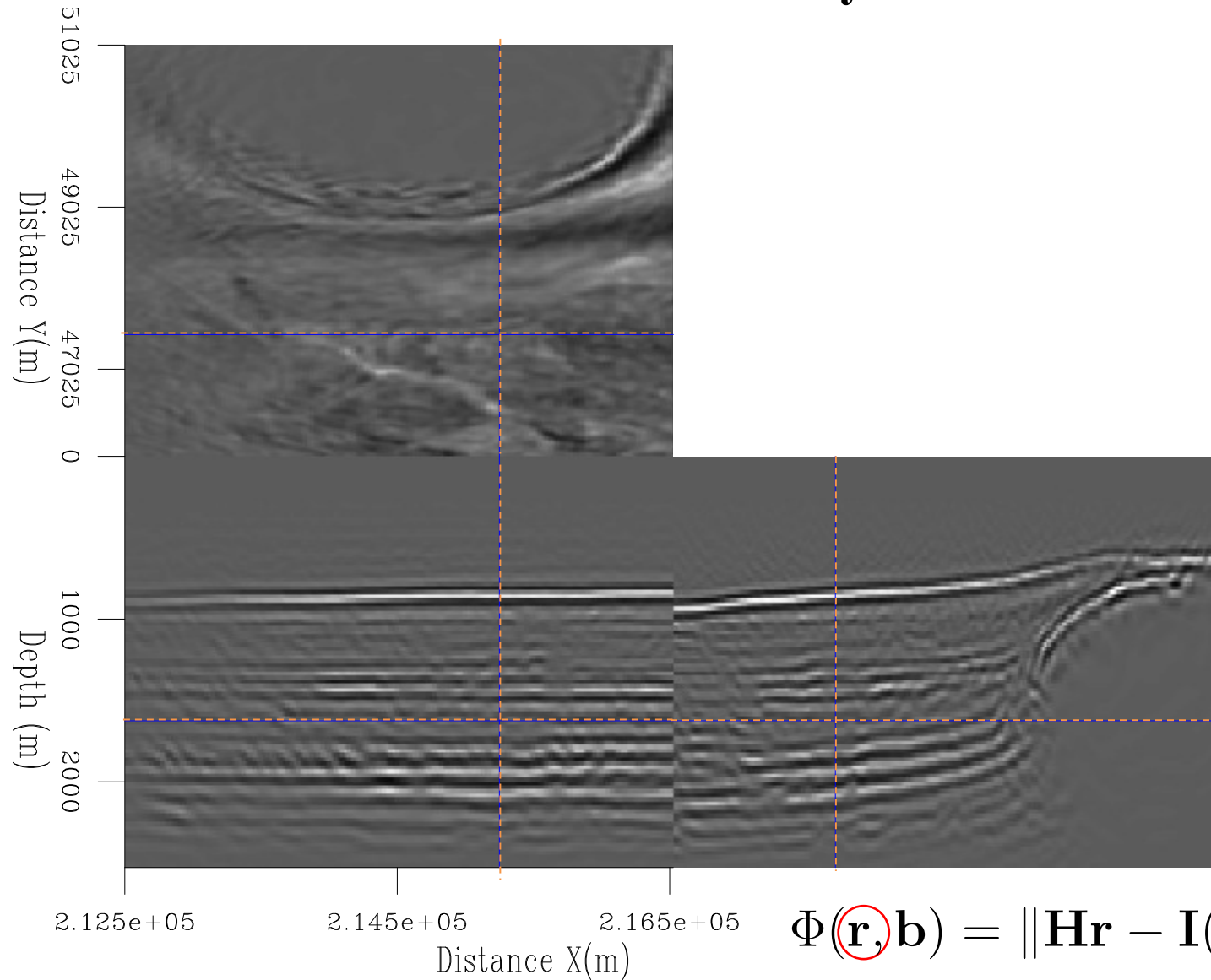




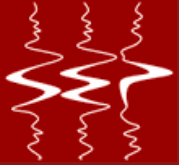


# 3D NUMERICAL RESULTS

## JIRB reflectivity

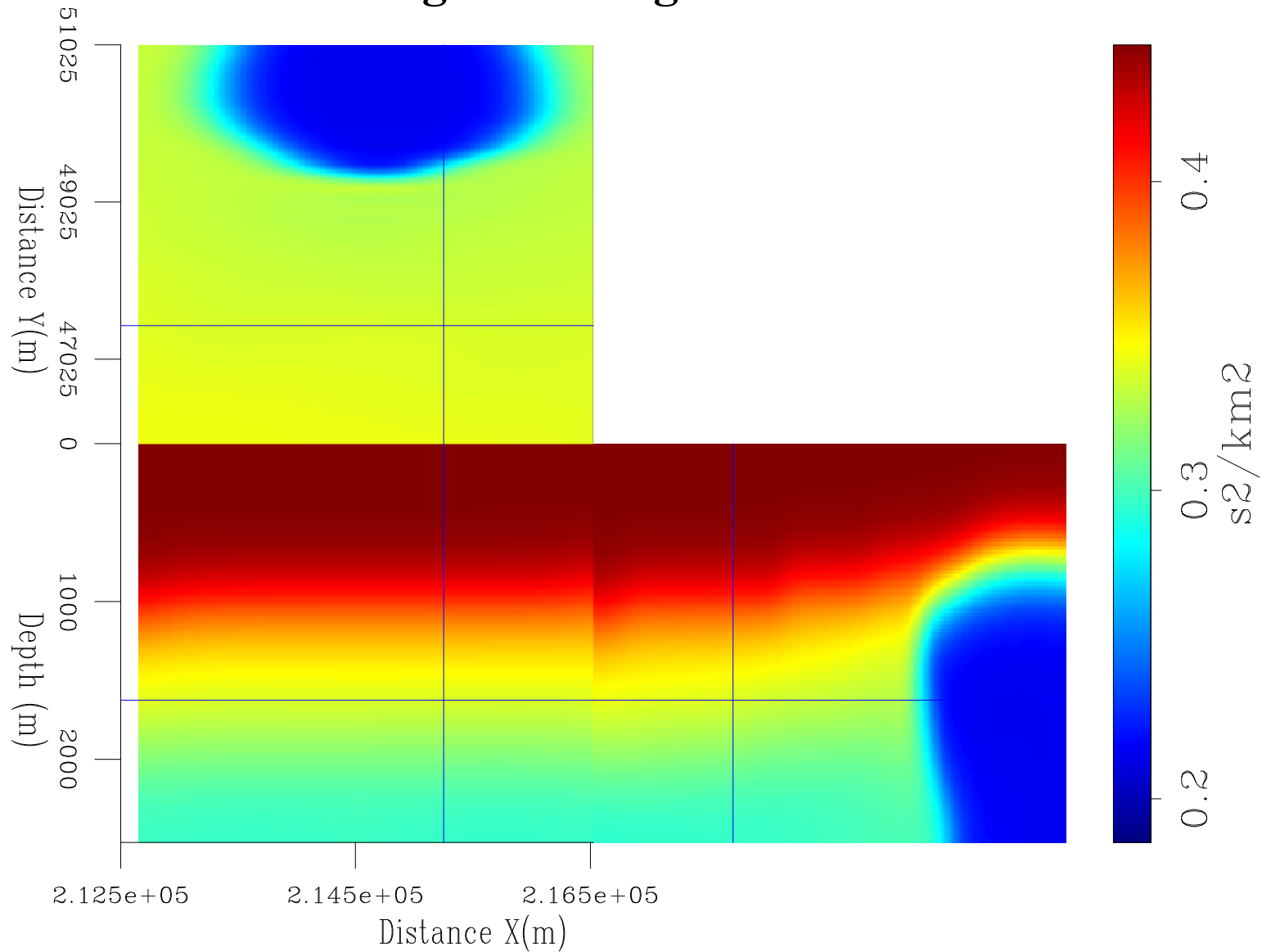


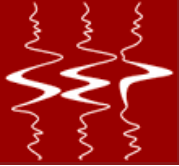
$$\Phi(\mathbf{r}, \mathbf{b}) = \|\mathbf{H}\mathbf{r} - \mathbf{I}(\mathbf{b})\|_2^2 - \lambda\|\mathbf{I}(\mathbf{b})\|_2^2$$



# 3D NUMERICAL RESULTS

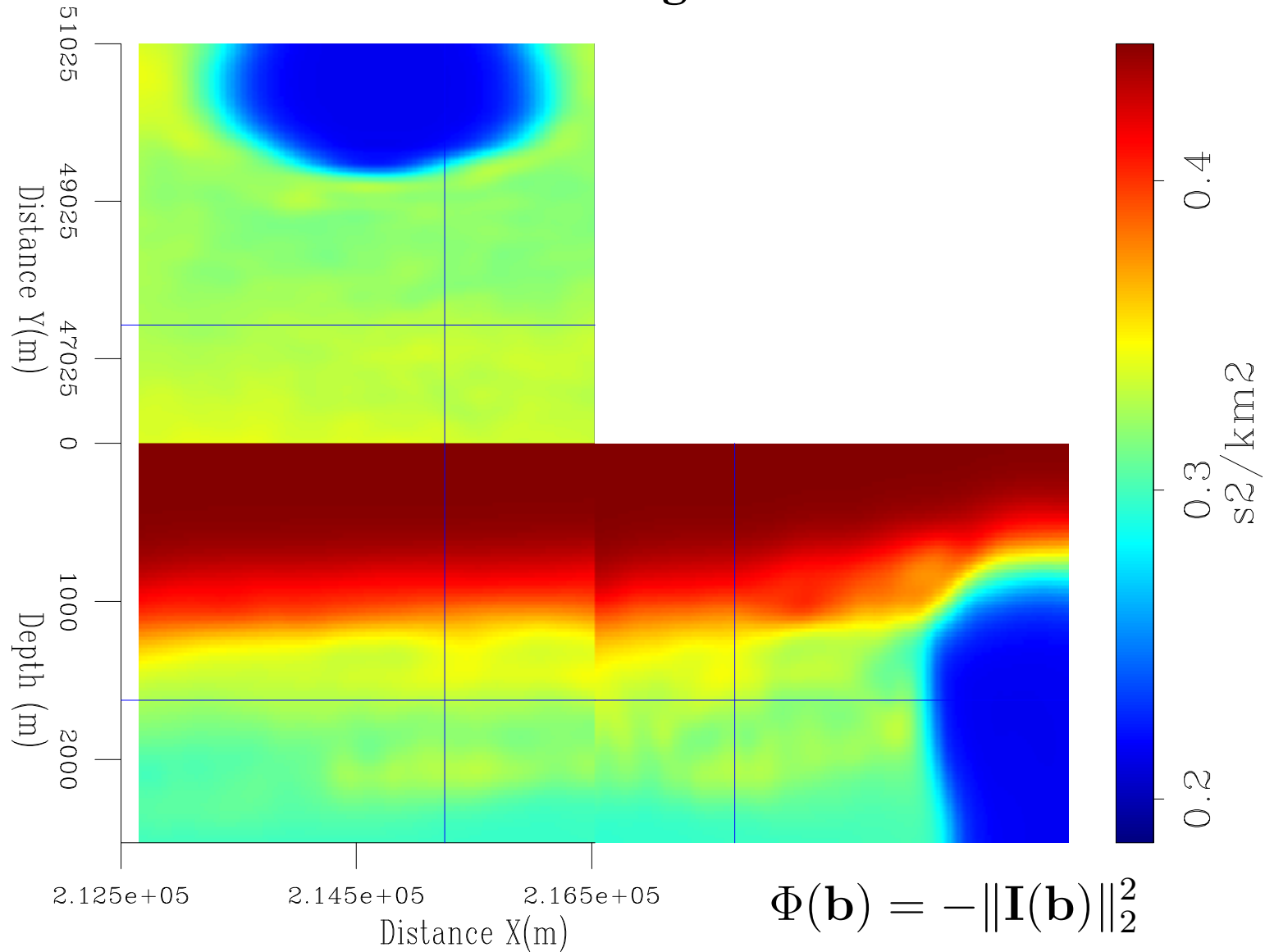
## Original background model





# 3D NUMERICAL RESULTS

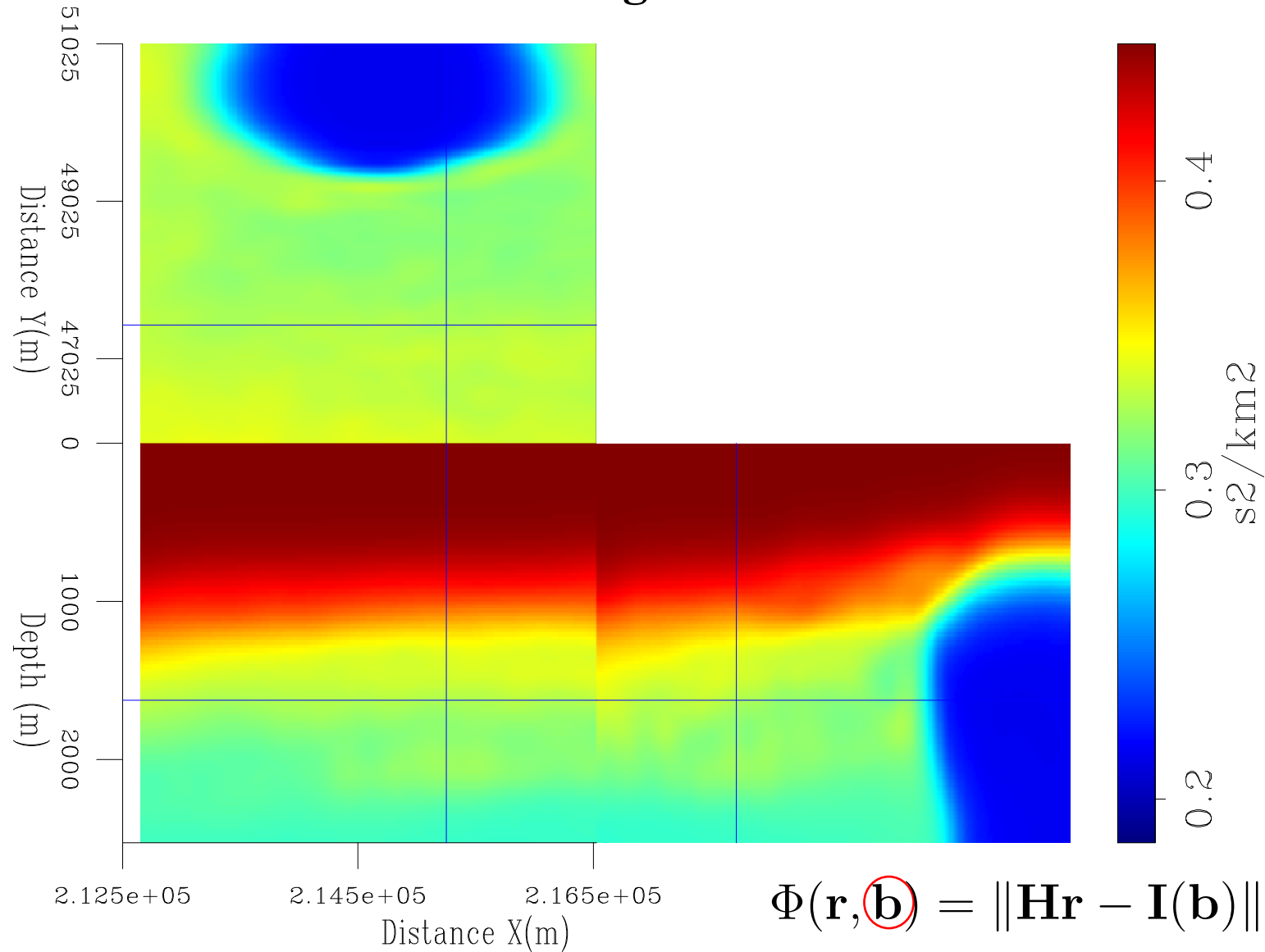
## WEMVA background model

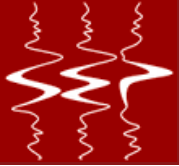




# 3D NUMERICAL RESULTS

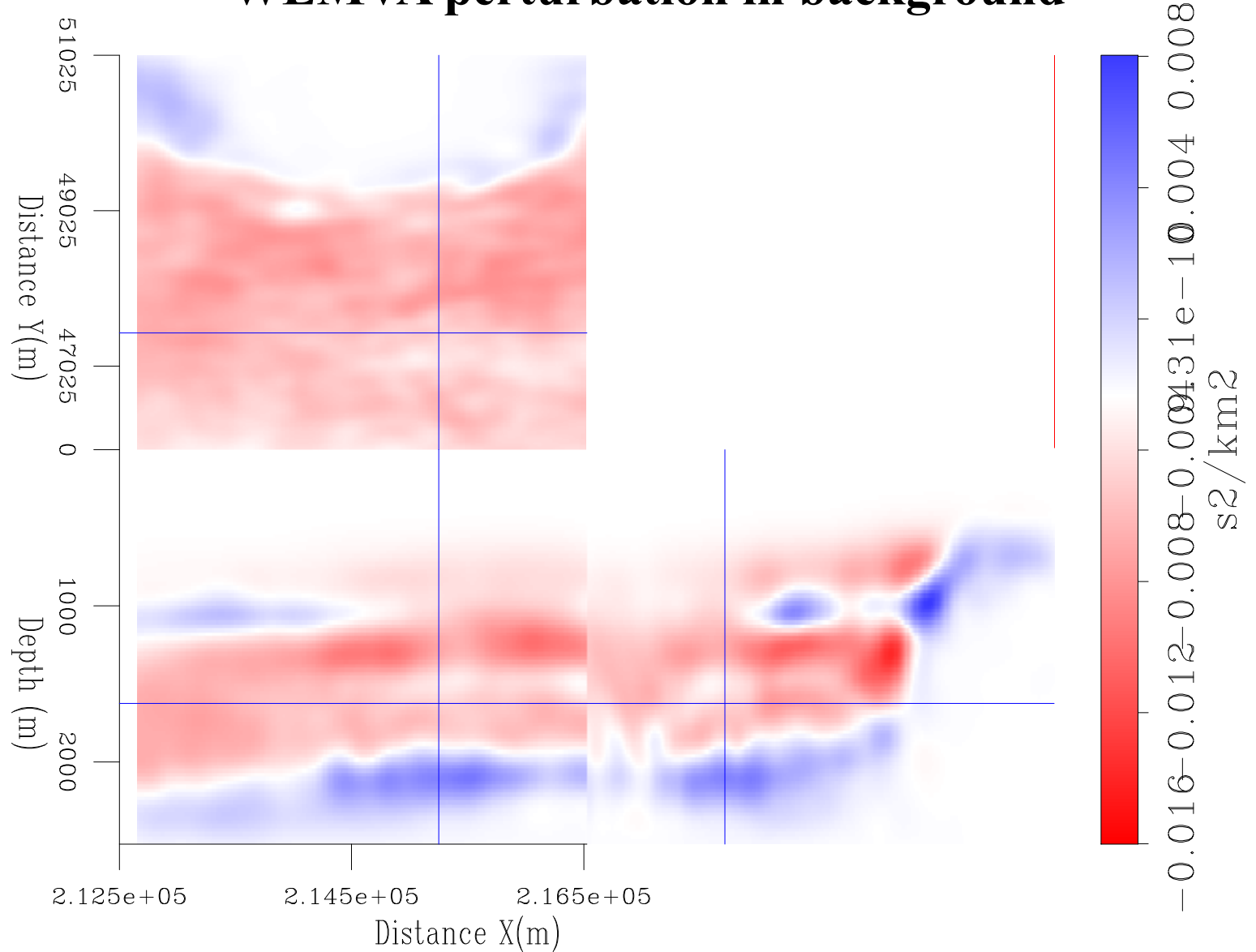
## JIRB background model

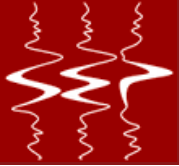




# 3D NUMERICAL RESULTS

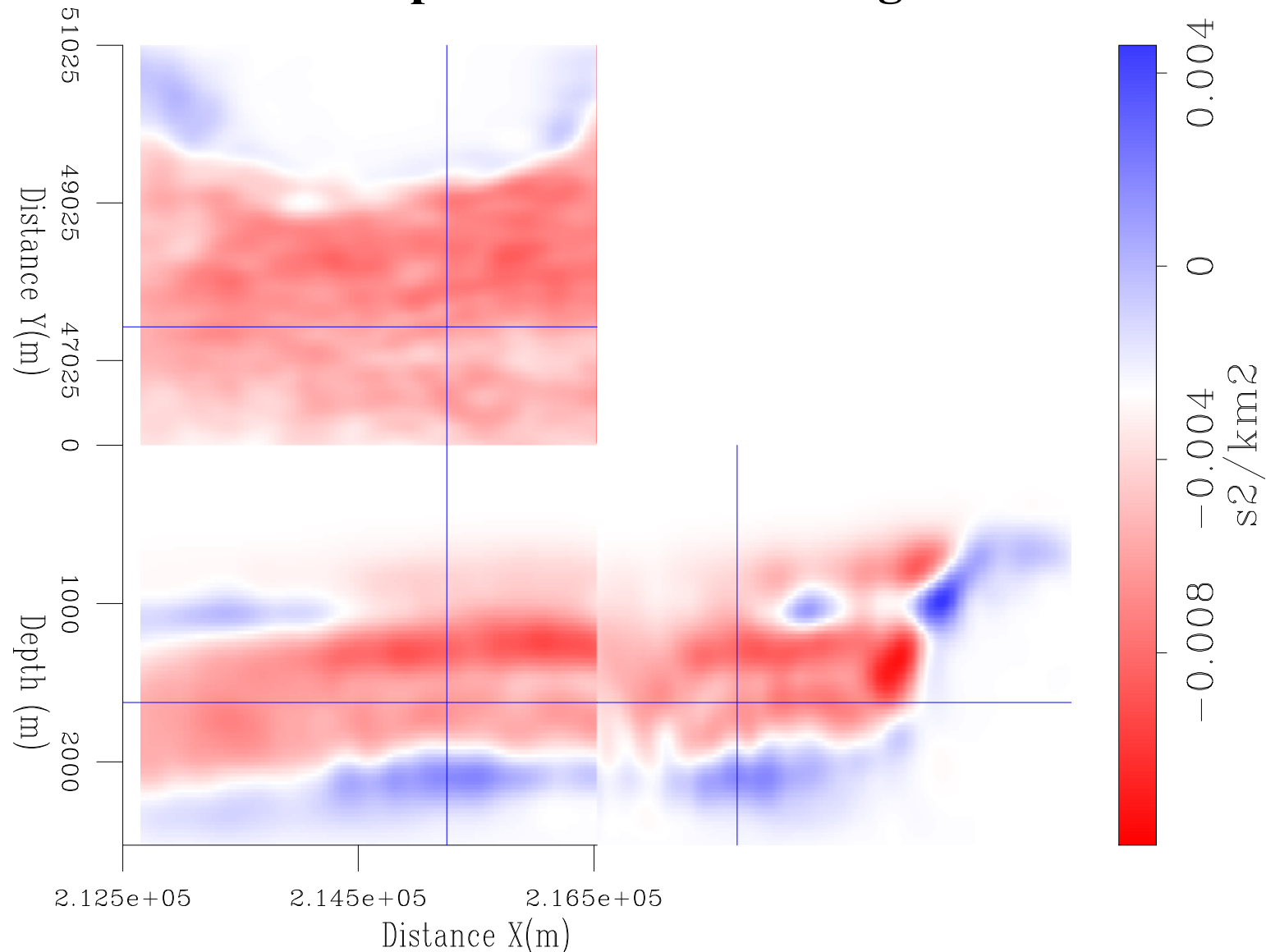
## WEMVA perturbation in background



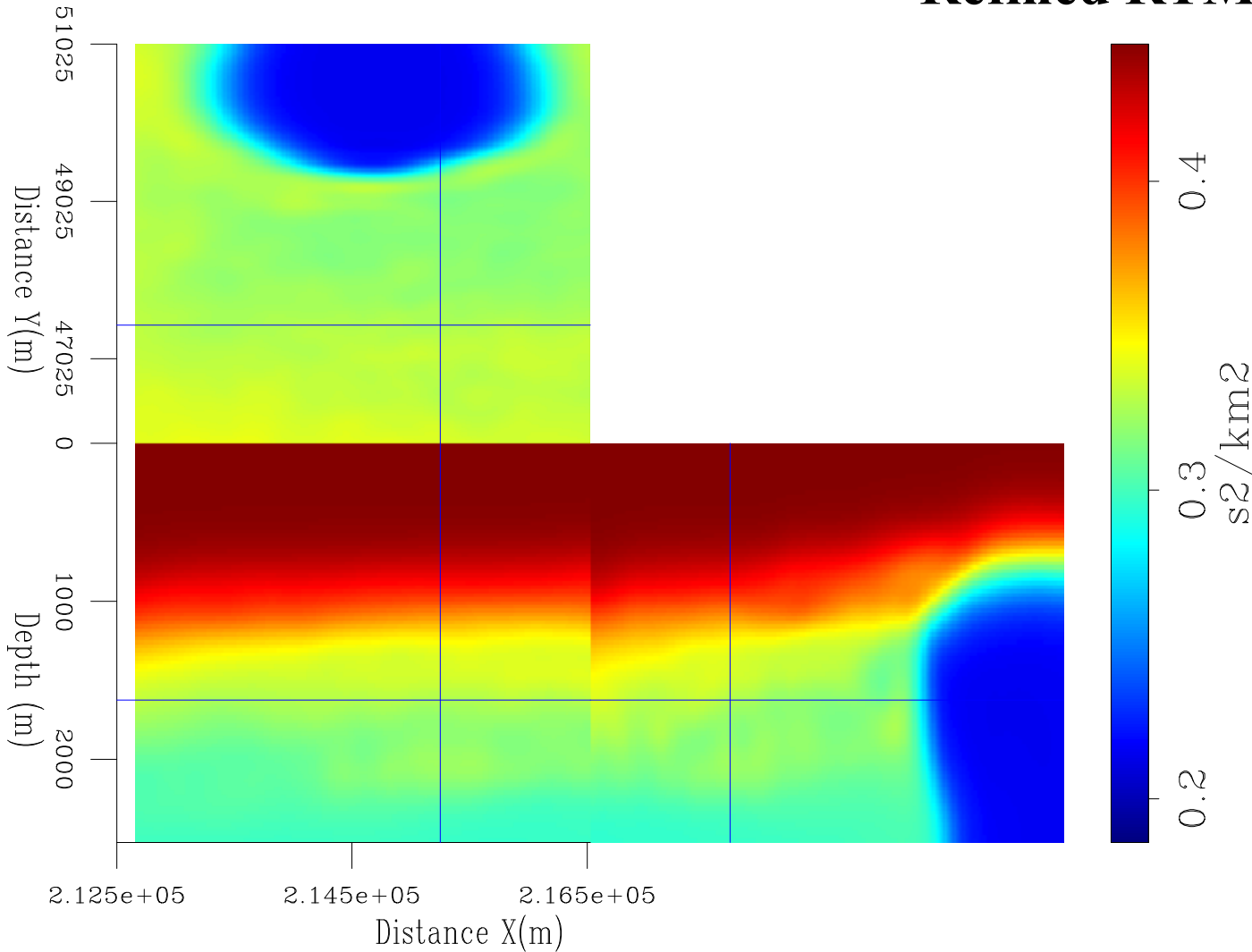


# 3D NUMERICAL RESULTS

## JIRB perturbation in background



## Refined RTM tests



Objective: Improve stratigraphic features

- Refine model to 12.5x12.5x12.5 m
- Re-bin data to 12.5x12.5 m grid
- 877x681=597237 traces
- Imaging aperture: 50 samples
- Duplicate dom. frequency ( $\sim 19$  Hz)
- Run refined RTM tests for initial background model, WEMVA, and JIRB background models



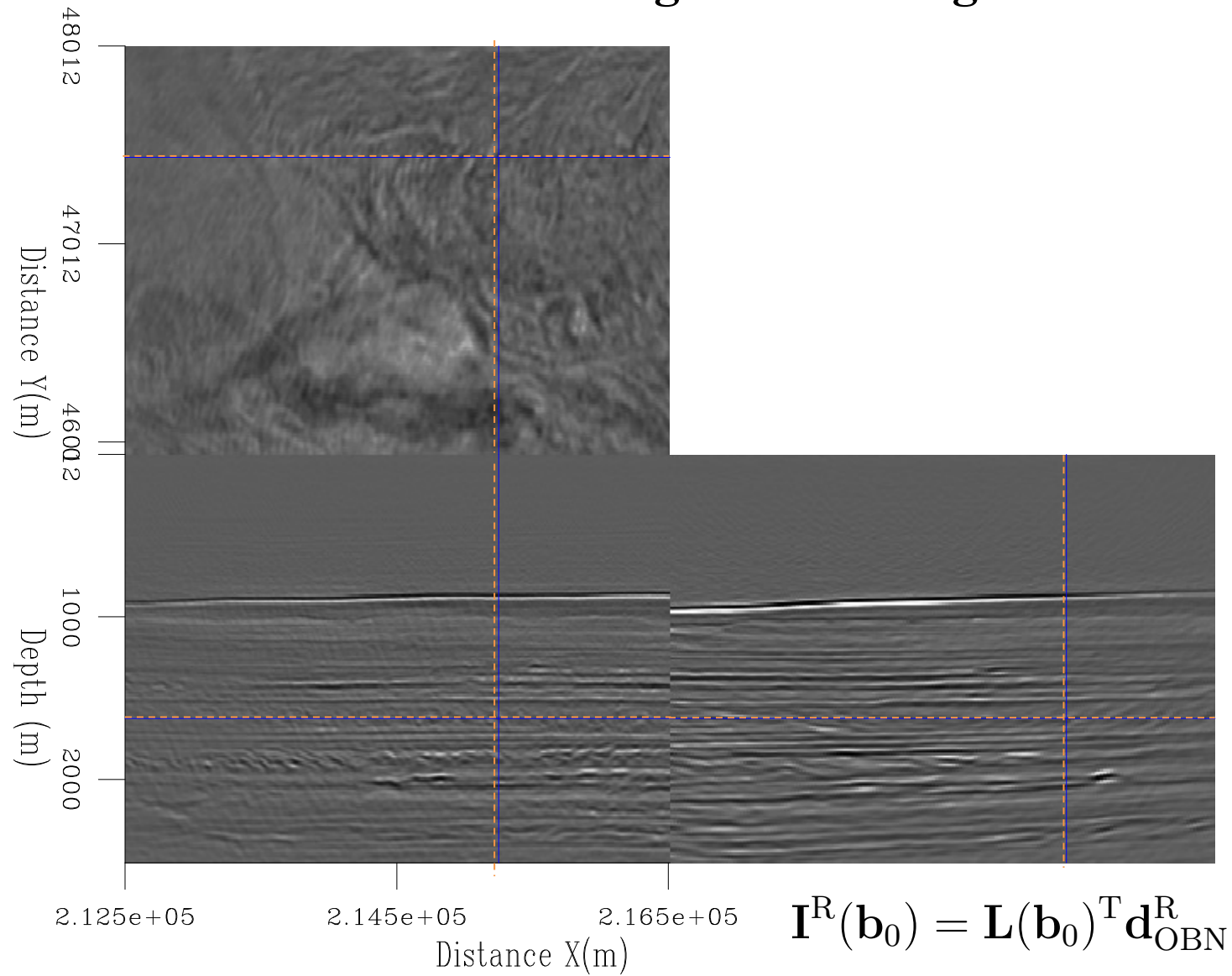
Compare refined RTM images run with initial model vs. WEMVA model

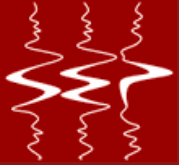




# 3D NUMERICAL RESULTS

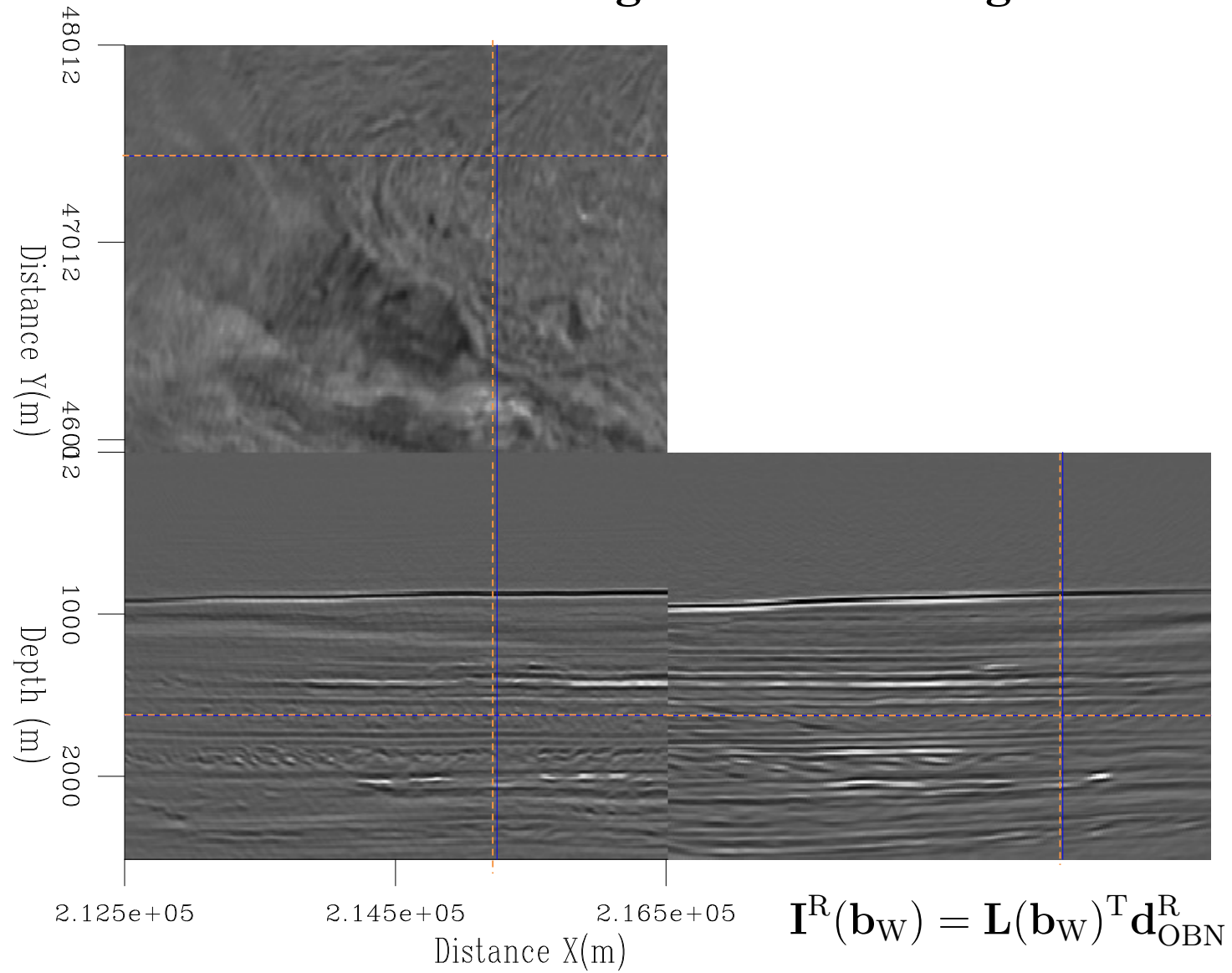
## Refined RTM using initial background

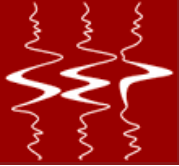




# 3D NUMERICAL RESULTS

## Refined RTM using WEMVA background



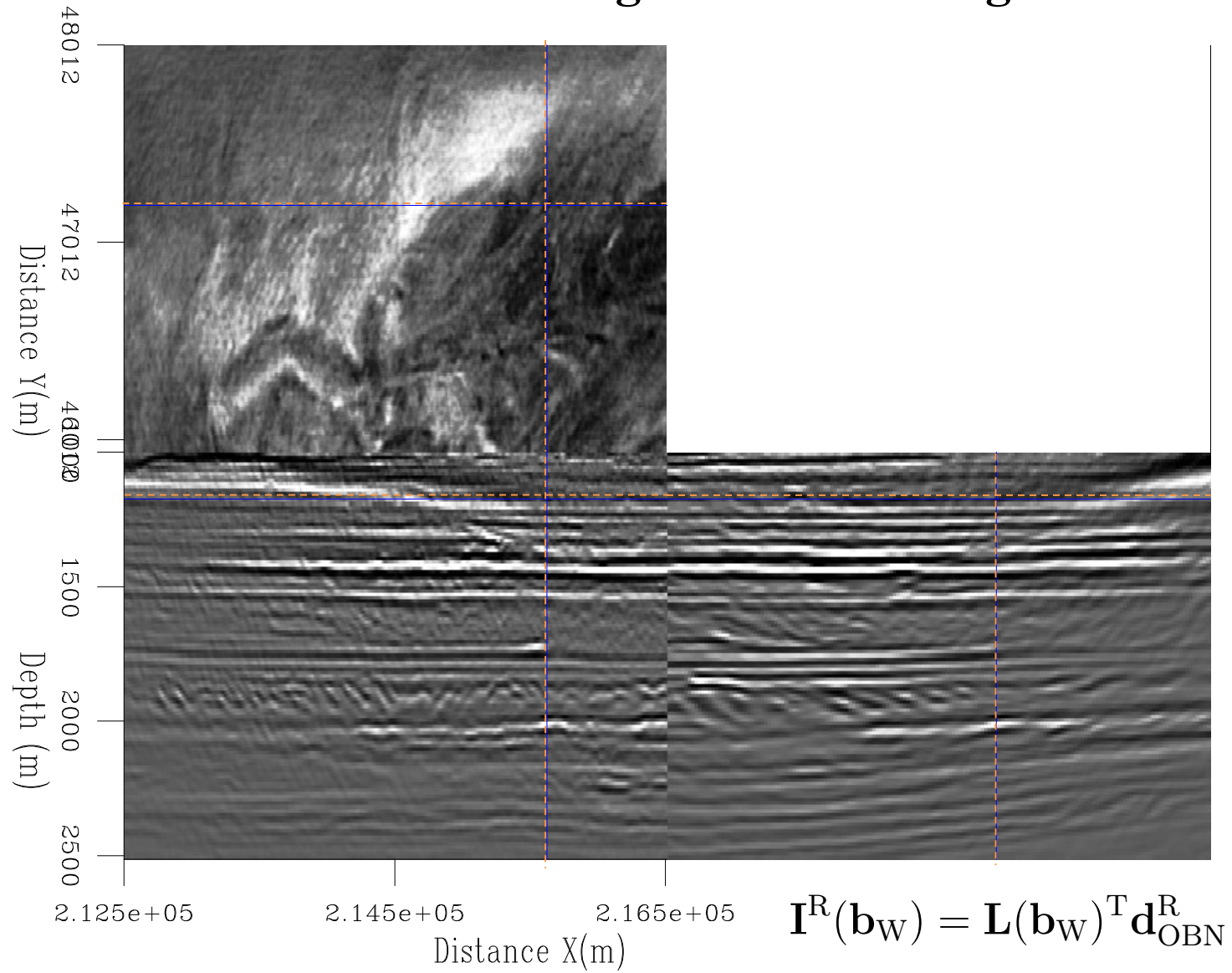


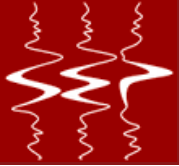
Compare refined RTM images run with  
WEMVA model vs. JIRB model



# 3D NUMERICAL RESULTS

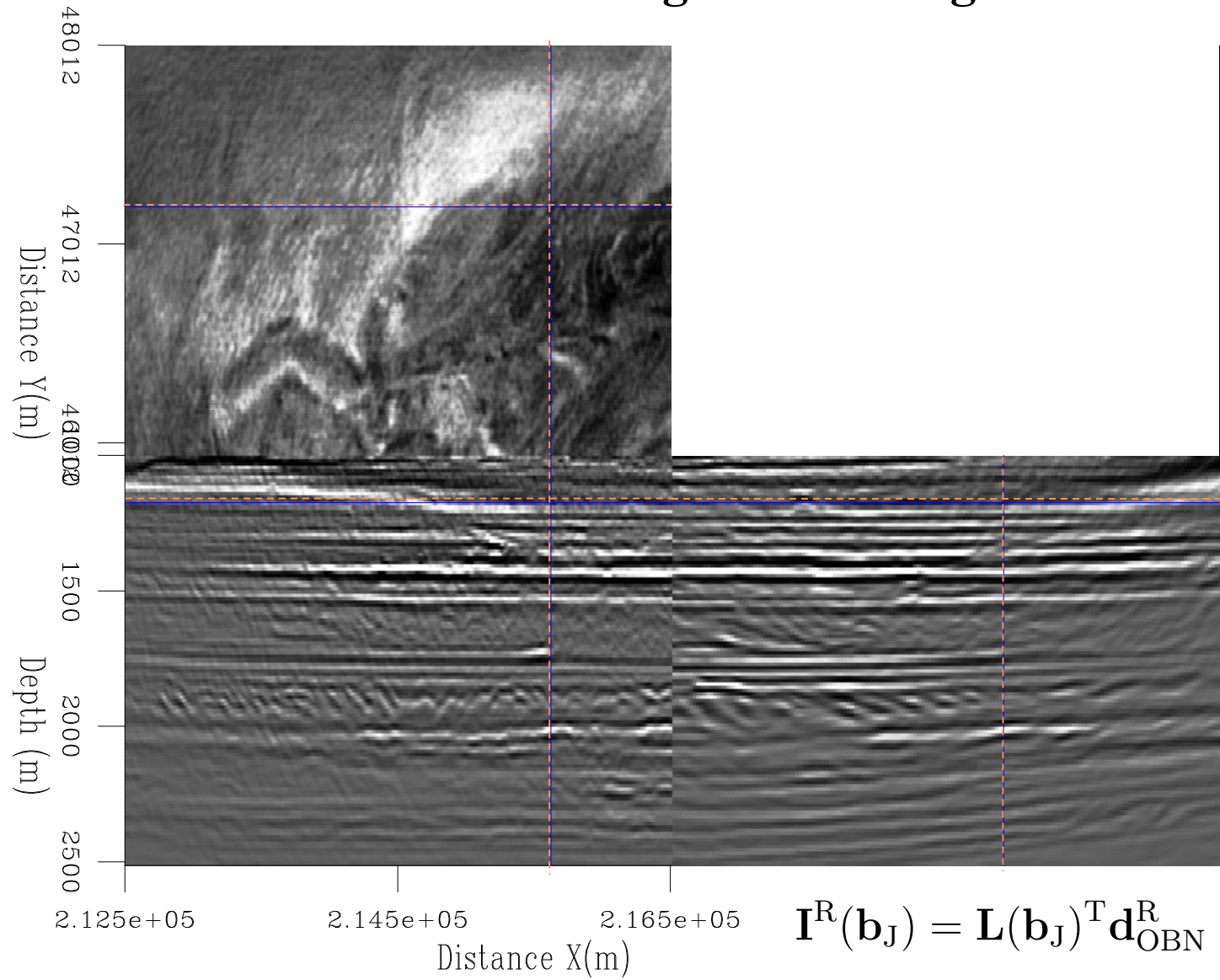
## Refined RTM using WEMVA background

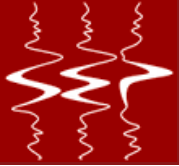




# 3D NUMERICAL RESULTS

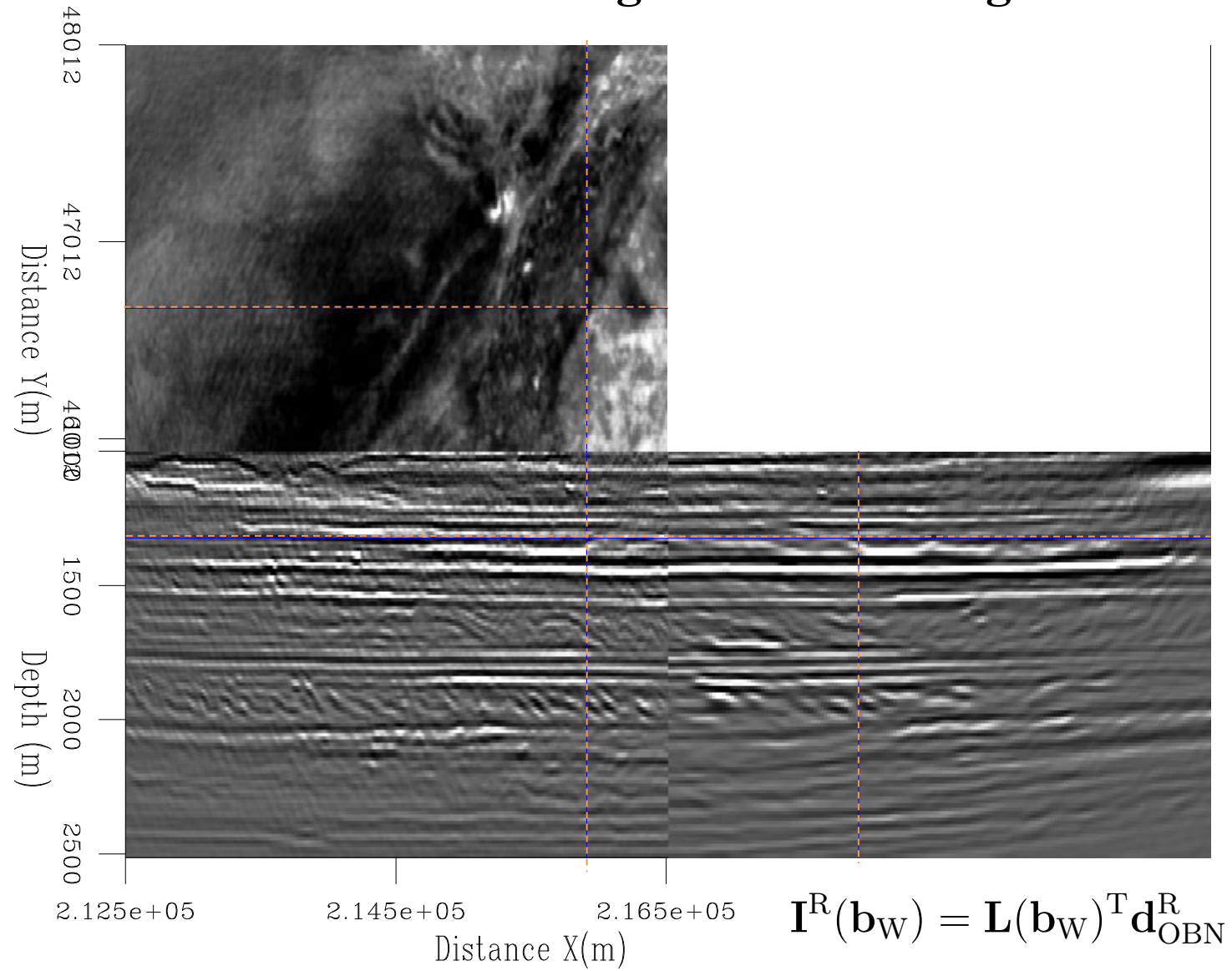
## Refined RTM using JIRB background





# 3D NUMERICAL RESULTS

## Refined RTM using WEMVA background

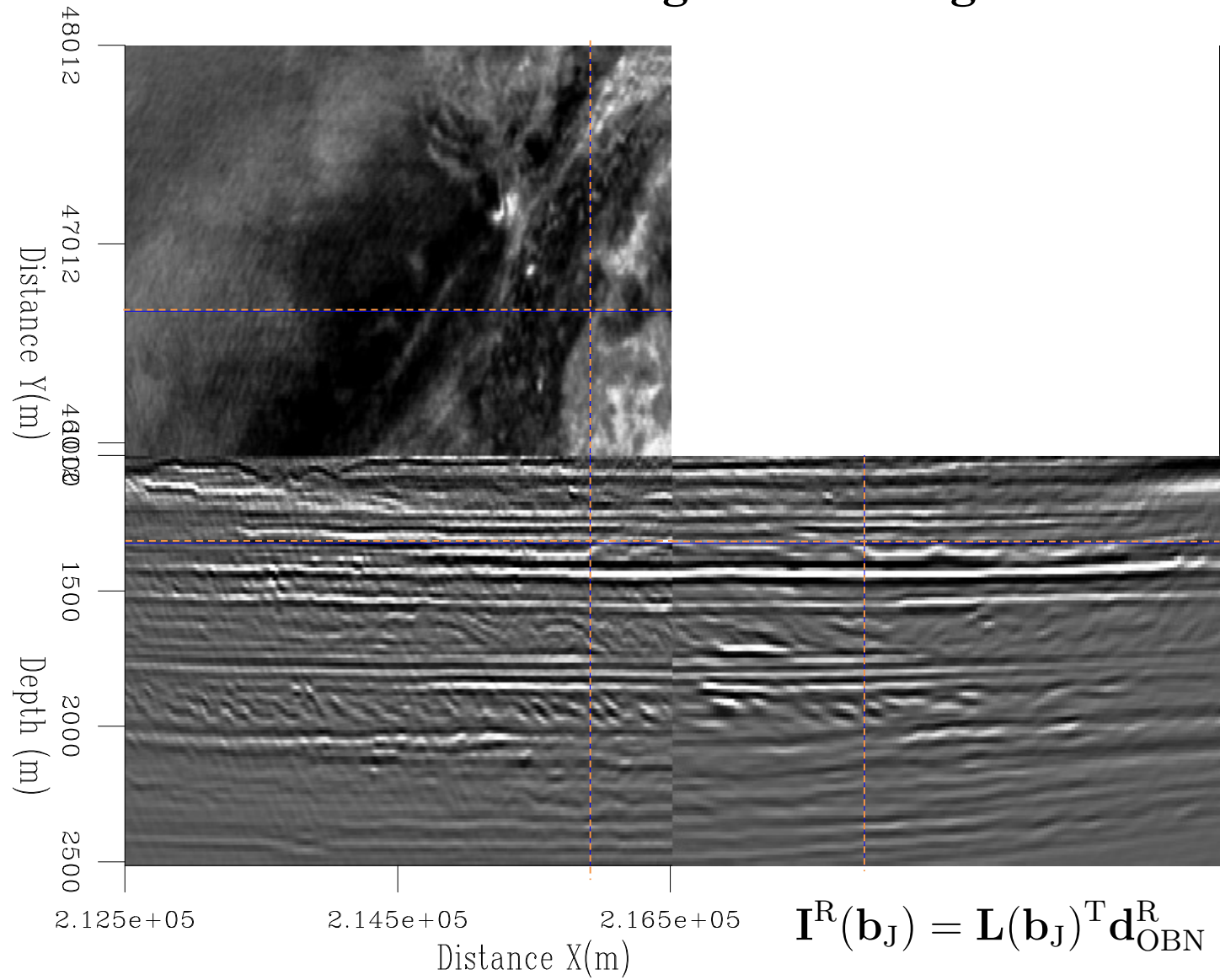


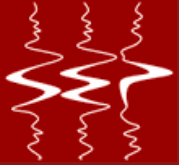




# 3D NUMERICAL RESULTS

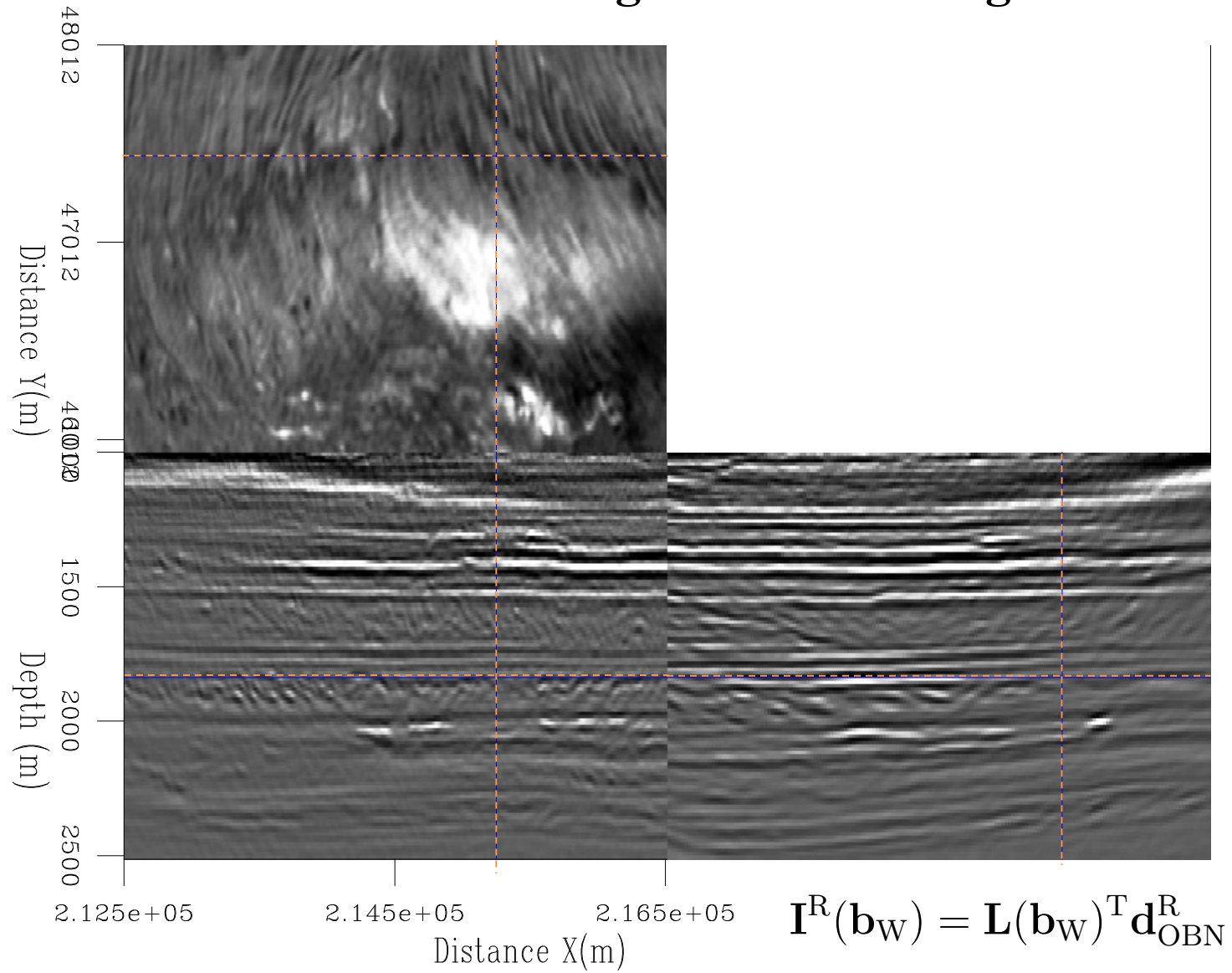
## Refined RTM using JIRB background





# 3D NUMERICAL RESULTS

## Refined RTM using WEMVA background

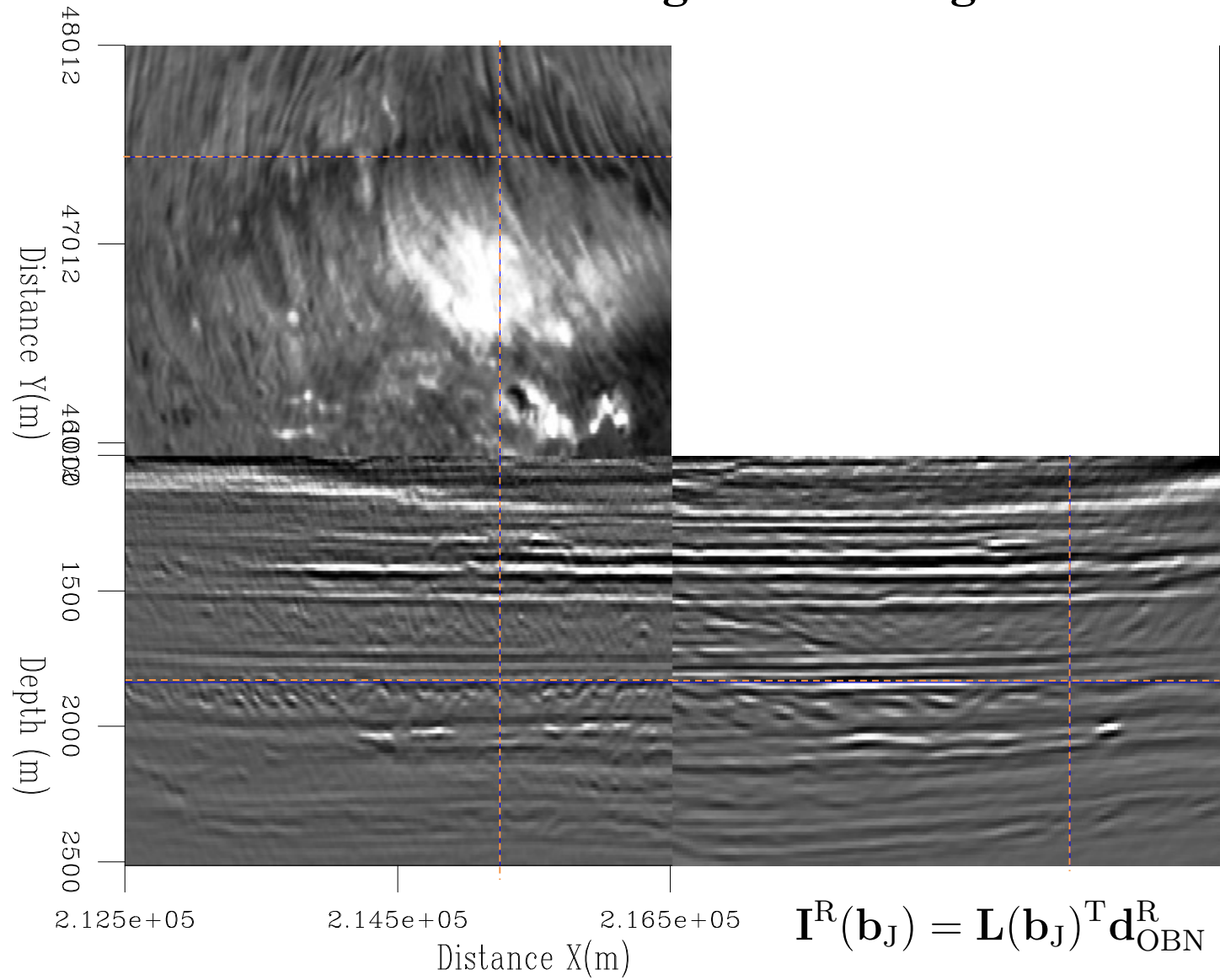


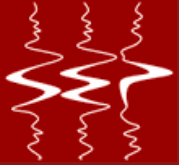




# 3D NUMERICAL RESULTS

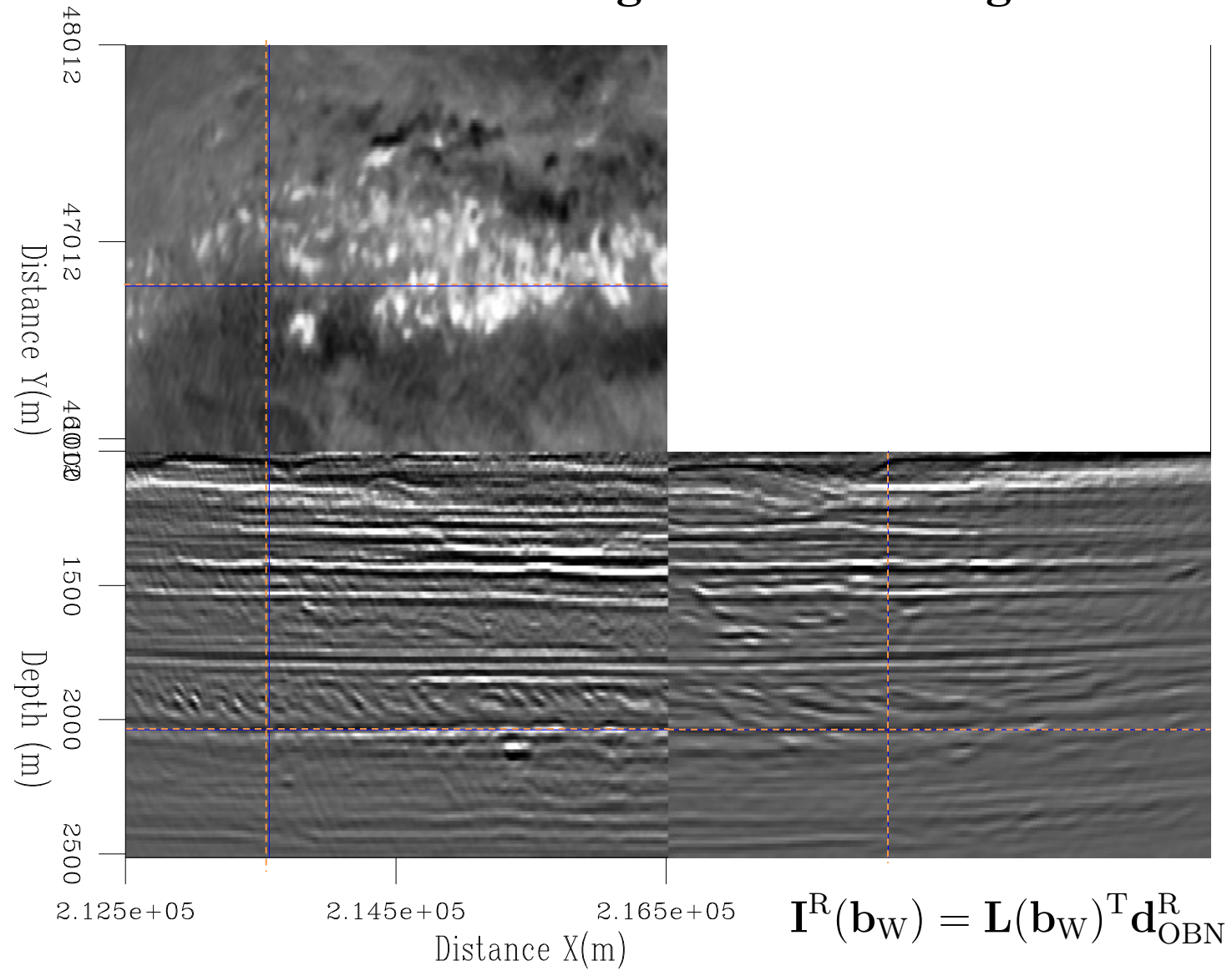
## Refined RTM using JIRB background

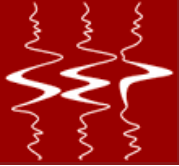




# 3D NUMERICAL RESULTS

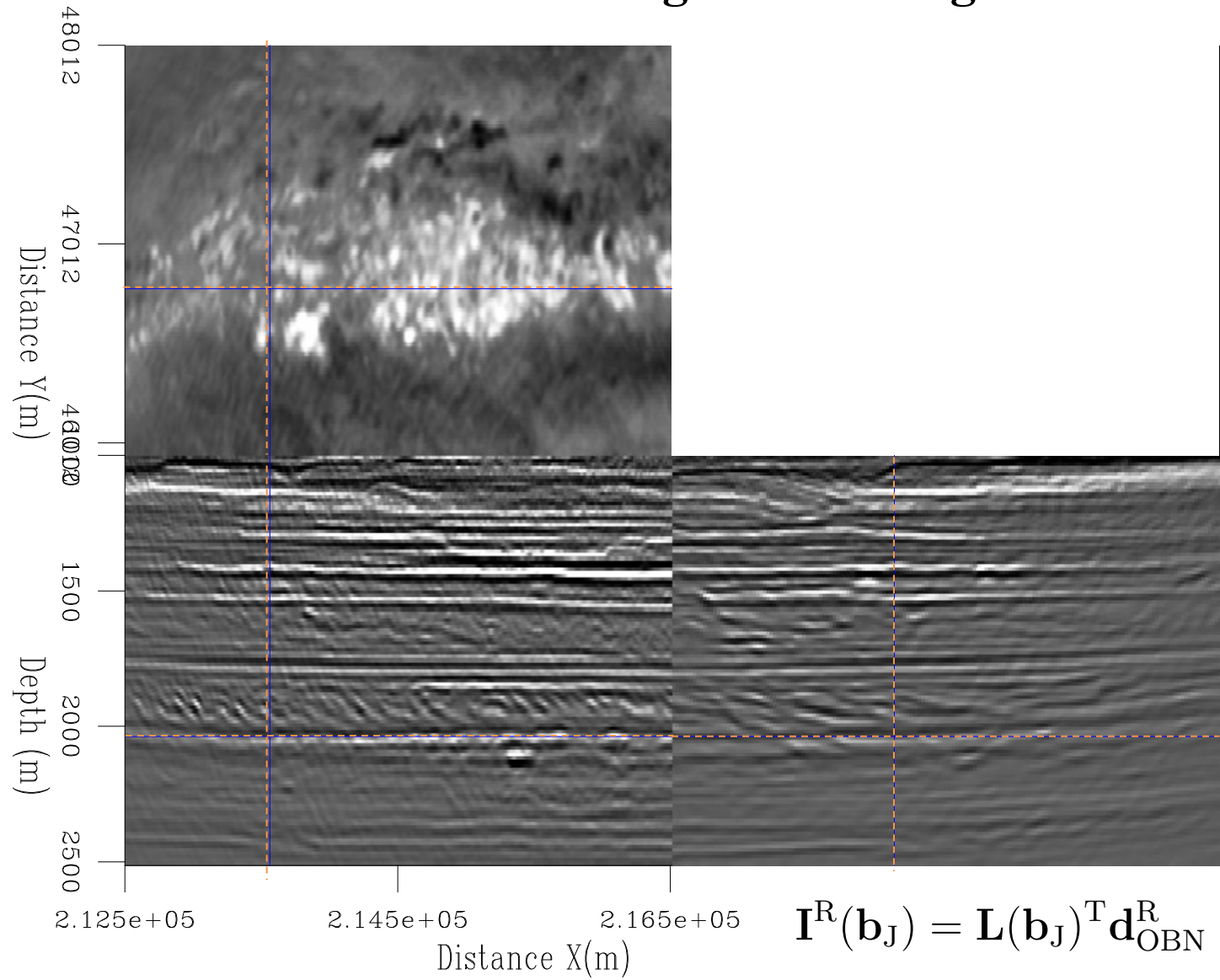
## Refined RTM using WEMVA background





# 3D NUMERICAL RESULTS

## Refined RTM using JIRB background



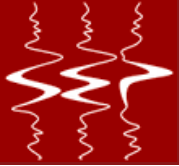


To conclude...

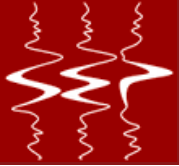


# CONCLUSIONS

- The JIRB method can correct remaining inaccuracies in the background model, yielding more focused seismic events in the reflectivity image
- The JIRB method can also obtain a better background model for RTM or LWI
- The method could not be implemented in a linear fashion. A nonlinear scheme was the solution
- Synthetic and field data tests show improvement in seismic events' focusing. In particular, the 3D field data exhibited improvements in deep-water stratigraphic features



# Acknowledgements



Thanks to Shell, granting permission to use the OBN dataset

- Special thanks to Bonnie Jones, for giving the permission on behalf of Shell, and for her comments on Chapter 5





Biondo



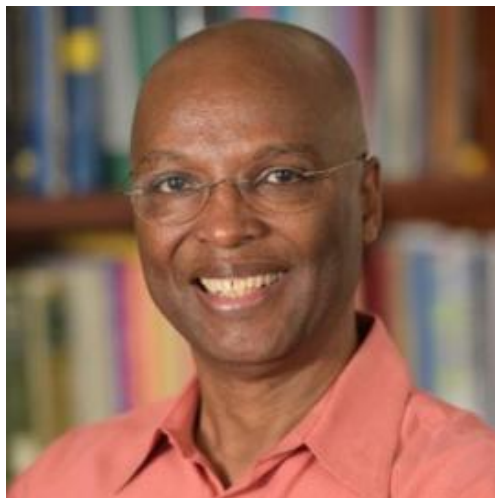
Bob



Louis



Jenny

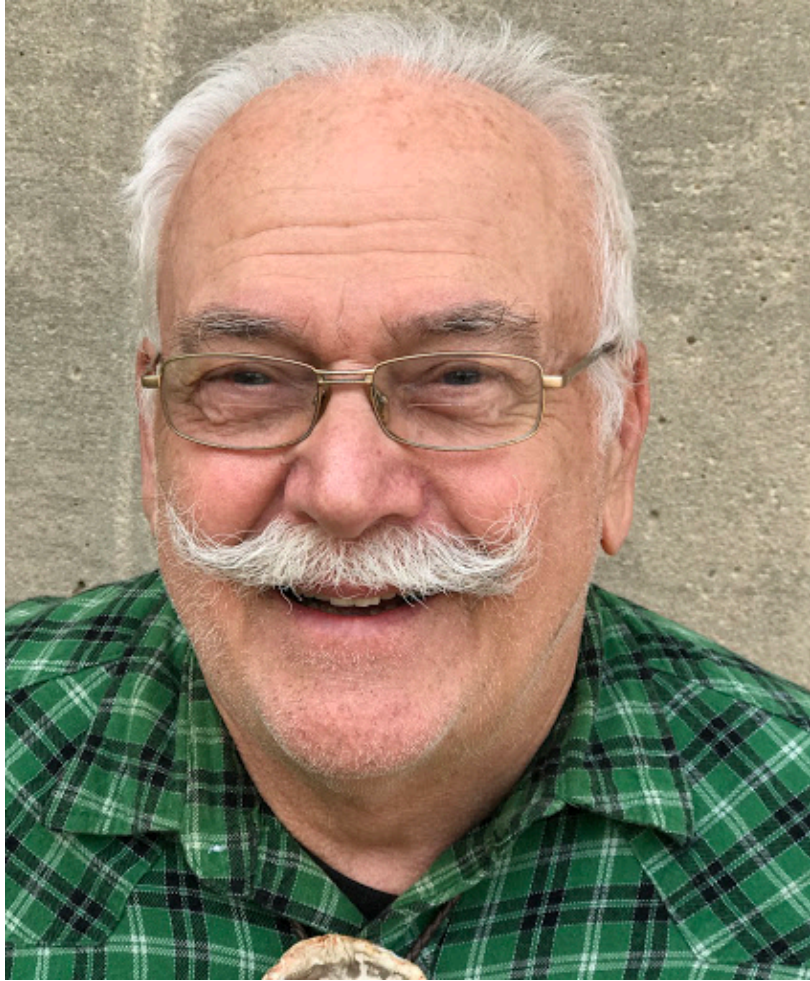


Jerry



Gary





Jon

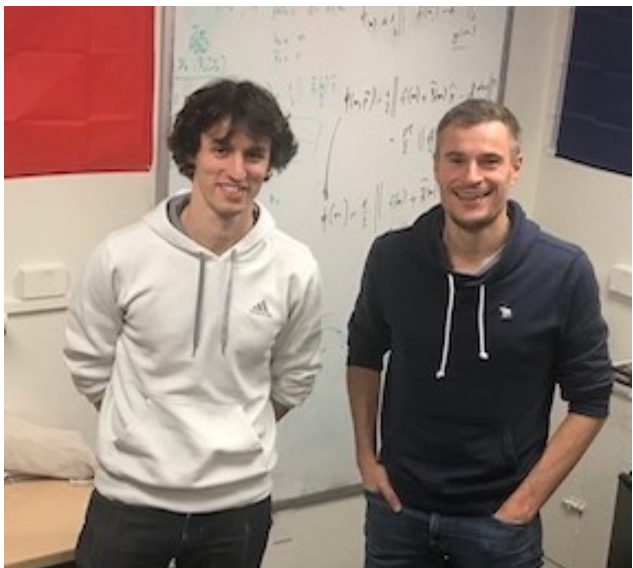


Stew



Shuki





Ettore & Guillaume



Fantine



Yinbin



Rahul



Joe



Taylor



Rustam



Milad



Rachael



Jared



Claudia



Liliane









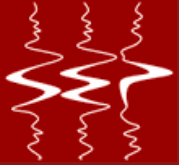


## Pemex's crew:

- The bosses: Humberto Salazar, Carlos Caraveo, Alfredo Vázquez, Leonardo Aguilera,...
- Current colleagues: Karen, Alejandra, Ernesto, Sergio, Silvino, Madai, Juan, Jorge,...
- Friends: Javier Sánchez, Humberto Arévalo, Sergio Chávez, Moisés Hernández,...



**PEMEX**



THANKS FOR YOUR ATTENTION!

