# Seismic Modeling, Migration and Velocity Inversion Full Waveform Inversion

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May 18, 2014



## Outline

## Full Waveform Inversion

The Basic Idea

### Marmousi Example

- Estimating the Initial Model
- > FWI
  - Marmousi
  - SEG AA'



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## Full Waveform Inversion

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# **Full Waveform Inversion (FWI)**

Velocity inversion is based on a very simple idea.

- Find that Earth model *M* that best explains the recorded data *D* 
  - Synthetic data U generated over M should match D as closely as possible
- Minimize an objective function || D U || where || || is the
  - $L^1$  norm
  - least squares norm
  - least squares norm of the phase difference between D and U
  - least squares norm of the envelope difference between D and U
  - least squares norm of the logarithmic difference between D and U



## **The Inversion Scheme**

In the classical least squares case FWI is an iterative scheme

$$M^n = \mathbf{M}^{n-1} - \mathbf{R}^{n-1} \left( D - U \right)$$

#### where

- At each iteration  $\mathbf{R}^{n-1}$ 
  - Is a very fancy imaging condition
  - Produces an incremental  $\Delta M$
  - Is almost always some form of reverse time migration
    - But it need not be



## **Full Waveform Inversion**

#### For a given model

- For each observed shot, synthesize data to match the real acquisition
  - Use a full two-way modeling algorithm
  - Save a trace at each model node
- Compute the difference between the shot and the real data
  - These data are called the residuals
- Back propagated the residuals into the model
  - Use a full two-way modeling algorithm
  - Save a trace at each model node
- Preform a shot-profile migration of the residuals
  - The shot is the forward-propagated synthetic
  - The receiver traces are the back-propagated residuals
  - Divide the back by the forward propagated traces
- Normalize the image above by the velocity squared
- Add the normalized image to the current model
- Repeat the previous steps until the norm of the model difference is small
- FWI is really a iterative migration scheme



## Outline



The Basic Idea

### 2) Marmousi Example

- Estimating the Initial Model
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(a) Gather Picks

(b) Semblance Picks

(c) NMO'd Gather

Typical Marmousi gather with picks, a semblance panel with picks, and the NMO corrected gather.

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(a) Marmousi Time-RMS model

(b) Marmousi Depth-Interval model

Initial stacking velocity models in time-RMS (left) and interval-depth (right).

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#### First iteration Marmousi stacking velocity based Kirchhoff migration.

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(a) Marmousi Time-RMS model

(b) Marmousi Depth-Interval model

Second Kirchhoff based MVA models in time-RMS (left) and interval-deptherese (right).

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#### Second iteration Marmousi Kirchhoff based MVA Kirchhoff migration.





(a) Marmousi Time-RMS model

(b) Marmousi Depth-Interval model

Second Kirchhoff based MVA models in time-RMS (left) and interval-deptherese (right).

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#### Third iteration Kirchhoff based MVA Kirchhoff migration.



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| ▼ gathers - Marvel Version 2.1.1.30, Panorama Tech <2- = □ |       |            |           |                           |         |     |     |     |     |      |     |     |      | 36 0  |       |        |         |      |   |
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|  | 0     | - 280      | 350       | 420                       | 490     | sęo | e30 | 200 | 770 | 840  | 910 | aģģ | 1050 | 11,20 | 11,90 | 1260   | 13,30   | 1400 |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 200   | -          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 400   | -          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 600   | -          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 800   |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1000  | <b>)</b> – |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1.200 |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1204  | -          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1400  | - c        |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      | 2 |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1600  | 3 - C      |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 1.800 | o –        |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 2000  | <b>-</b>   |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 2200  | o          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 2400  |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 260   |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  |       |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 280   | 9 - C      |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | 3000  | ,          |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      | * |
|  | •     |            |           |                           |         |     |     |     |     |      |     |     |      |       |       |        |         |      |   |
|  | p=0   | cdp=99     | 91 t=-108 | ep=0 cdp=991 t=-108 amp=0 |         |     |     |     |     |      |     |     |      |       |       |        |         |      | 1 |

#### Fourth iteration Kirchhoff MVA based velocity model.





#### Fourth iteration Kirchhoff MVA based Kirchhoff migration.





#### Bottom horizon for constant velocity analysis.





# Fourth iteration Kirchhoff MVA based model with bottom horizon 4000 meter/second velocity flood.



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# Fourth iteration Kirchhoff MVA based model with bottom horizon 4000 meter/second velocity flood migration.



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# Fourth iteration Kirchhoff MVA based model with bottom horizon 5000 meter/second velocity flood migration.



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## The true Marmousi model.

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- Insufficient offset
  - Max of 2600 over 9000 km model
  - Approximately 1300 km velocity analysis basement
- Recording time too short (3 seconds)
- Long delay wavelet



## **Marmousi FWI**



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# **Marmousi Inversion**



## True Marmousi model.

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## **Process Review**

#### The true model

- Nine km by three km (depth)
- The observed data
  - Nine km offset
  - Broadband wavelet from .3 HZ to 50 HZ
    - Low frequency and long offsets are the key
  - Five second recording time
  - Model grid was 16m X 16m



## The observed data



#### Marmousi Synthetic Data

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## The inversion process

#### We started with a MVA model

- Virtually no reflections
- Reasonably accurate shallow
- First iteration essentially muted the first breaks
- First iteration is exactly equivalent to migrating with our initial model
  - Lailly: Migration is the first step in inversion
- We calculated a new velocity model from residuals and a synthetic shot
- We shot a new synthetic data set
- We imaged the residuals
- We repeated the exercise until model differences became negligible
- In this case the model is as good as can be expected

This kind of inversion is theoretically valid for all Earth Models.



# SEG AA' FWI



## We begin with a v(z) model and iterated for about 100 iterations.

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# FWI Summary

- Requires low frequencies
  - The lower the better
- Requires long offsets
  - The longer the better
- Generally gets the slow velocities
- Many iterations for fast velocity anomalies



# **Questions?**

