# Full Waveform Inversion in the data and image space

#### B. Arntsen, W. Weibull and E. B. Nilsen

NTNU Department of Petr. Techn. and Applied Geophysics borge.arntsen@ntnu.no

April 24, 2012

#### Overview

- 1. Introduction
- 2. Initial models for FWI
- 3. Wave Equation Migration Velocity Analysis
- 4. Joint Inversion in the image and data spaces
- 5. Numerical Example
- 6. Conclusions

#### Full Waveform Inversion loop



Full Waveform Inversion (FWI) minimization the least-squares error w.r.t. velocity (Tarantola, 1984)

$$e_l = |p - p^{obs}|^2 \tag{1}$$

Linearization leads to a Newton-Raphson Scheme where the first iteration is

$$\mathbf{J}^{T}[p_{0}-p^{obs}]=\mathbf{J}^{T}\mathbf{J}\Delta c \tag{2}$$

where  $\mathbf{J}$  is the Jacobi operator and the Born approximation is

$$\Delta p = p_0 - p^{obs} = \mathbf{J} \Delta c \tag{3}$$

$$\Delta c \approx \alpha \nabla_c e_l = \alpha \mathbf{J}^{\mathcal{T}}[p_0 - p^{obs}]$$
(4)





Distance (km)

Exact model



Velocity (Km/s)



2

3 0

#### Initial model B



2

Distance (km)

3

4

Velocity (Km/s)

Velocity (Km/s)

Exact model



Velocity (Km/s)





### Initial models for FWI

Born approximation holds (Beydoun and Tarantola, 1988)

$$\Delta T < \frac{1}{2f_0} \tag{5}$$

•  $\Delta t$  : Traveltime error between model and data

► f<sub>0</sub>: Dominant frequency

or (Pratt et al. 2008)

$$\frac{\Delta T}{T} < \frac{1}{N_{\lambda}} \tag{6}$$

- $N_{\lambda}$  : No of wavelengths
- T : Record time

### Initial models for FWI



Initial models for FWI



Jian-Bing et al. (2009) for

$$(\omega/c_0)^2 I < 1, \tag{7}$$

$$I = \max \left| \int g(x_r, \omega, x) \frac{\Delta c(x)}{c_0(x)} d^3 x \right|.$$
(8)

g is the acoustic Green's function. Give max frequencies  $\approx 1-10 \text{Hz}$  for both model A and B



Minimize  $e_s$  w.r.t c

$$e_{s} = \sum_{x} \sum_{h} h^{2} \left[ \frac{\partial R(\mathbf{x}, \mathbf{h})}{\partial z} \right]^{2}, \qquad (9)$$

Iterative solution

$$c = c_0 + \Delta c$$
$$\Delta c \approx \alpha \nabla_c e_s \tag{10}$$

- e<sub>s</sub> is mainly sensitive to travel-time
- Low resolution
- Relies on the Born Approximation



Initial model



Velocity (Km/s)

Velocity (Km/s)

#### WEMVA 25 iterations





Exact model



Velocity (Km/s)

Velocity (Km/s)

#### WEMVA 25 iterations









$$e = w_l e_l + w_s e_s \tag{11}$$

- ► w<sub>1</sub>, w<sub>s</sub>: Weights
- ► e<sub>l</sub>: Least-squares Inversion error
- ► e<sub>s</sub>: Differential semblance error

#### Initial model A



Velocity (Km/s)

#### WEMVA after 25 iterations



#### WEMVA model



Velocity (Km/s)

#### FWI after 25 iterations



Exact Model



Velocity (Km/s)

#### FWI after 25 iterations



#### Conclusions

- WEMVA produces low resolution velocity models with reasonable good kinematic properties from simple initial models
- WEMVA velocity models can be used as initial models for FWI to obtain high resolution velocity models

### Acknowledgements

 ROSE consortium, Norwegian Research Coiuncil and Statoil for financial support.