

# An approach to the study of time, time-frequency and time-scale transformations for seismic migration problems

Juan Guillermo Paniagua

Advisor  
Olga Lucía Quintero  
Universidad EAFIT

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- 1 Antecedents
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- 4 Work perspectives
- 5 References

# Antecedents



## Research project ECOPETROL-COLCIENCIAS

**Seismic pre-stack migration in depth by extrapolating wave fields using high performance computing for massive data in complex areas.**

Cooperative research project: Universidad de Antioquia, Instituto Tecnológico Metropolitano -ITM, Universidad Industrial de Santander, Universidad de Pamplona.

# Antecedents

## Challenges in the oil industry

- Minimizing exploration costs.
- Minimize the degree of uncertainty in exploration.
- Improve subsurface characterization.
- Deepwater oil reservoirs.
- Deep reservoirs and complex areas.
- Small reservoirs in known areas.



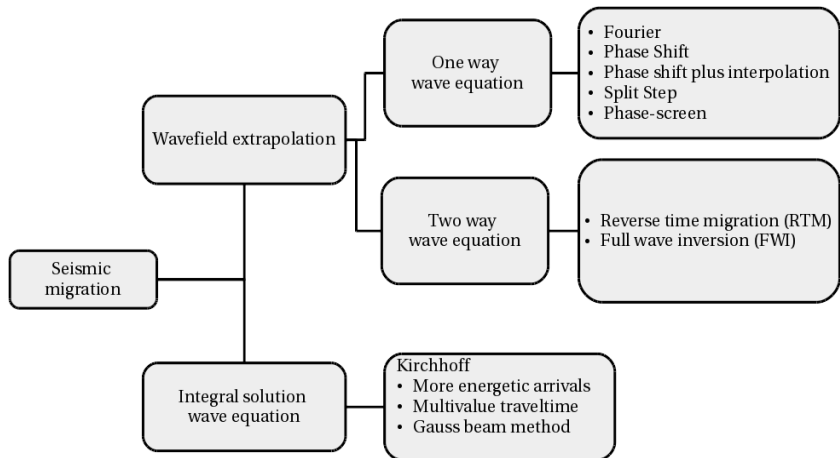
# Antecedents

## Marine seismic acquisition

<https://youtu.be/ZesI8PevfAQ>

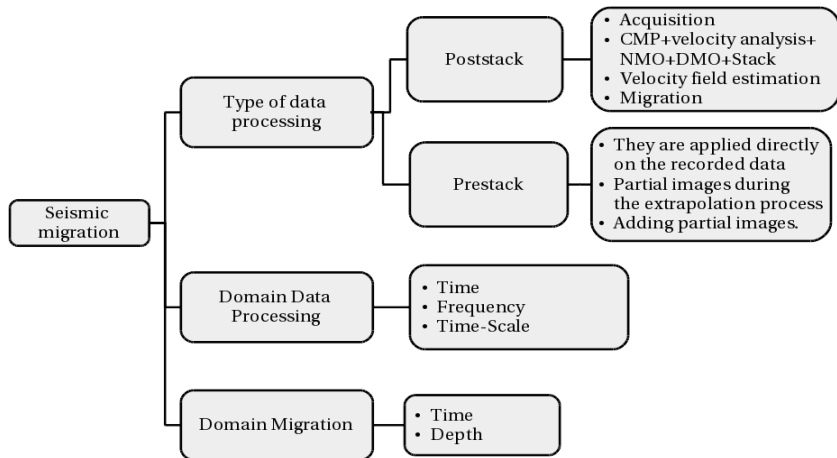
# Antecedents

## Seismic migration

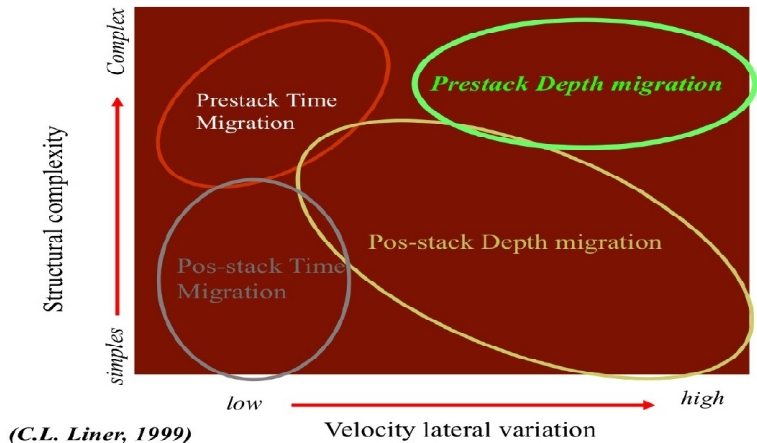


# Antecedents

## Seismic migration



# Antecedents



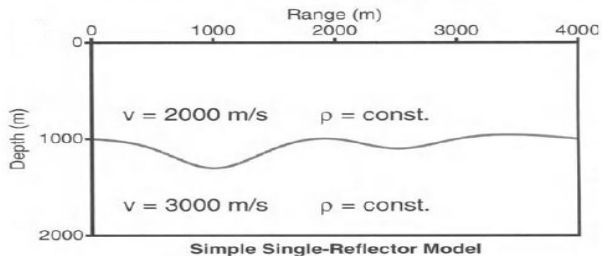


# Background

- Geometric migration(until 1960)<sup>1</sup>.

# Background

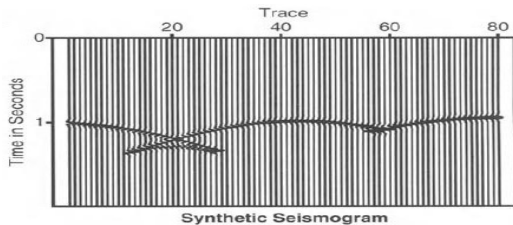
- Geometric migration(until 1960)<sup>1</sup>.



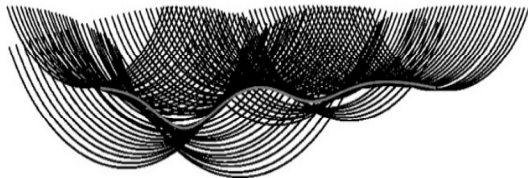
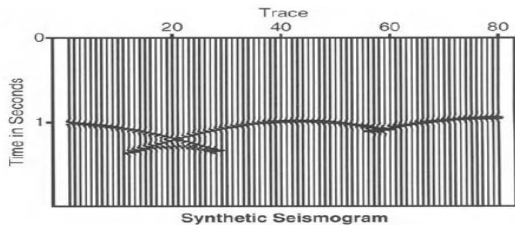
Hagedoorn, 1954, [40]

# Background

# Background



# Background



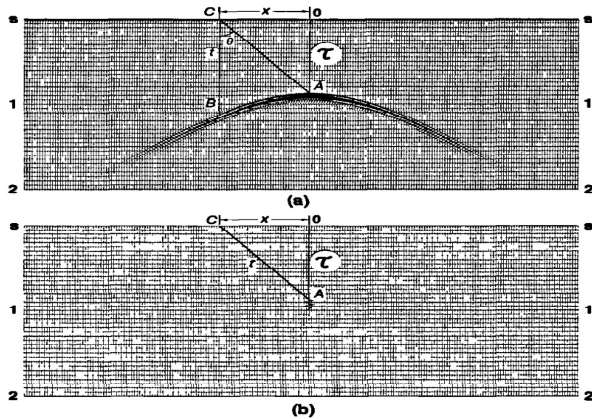
# Background

- Geometric migration(until 1960)
- **Diffraction summation migration (or diffraction stack)<sup>2</sup>.**

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Schneider, 1971, [52]

# Background



# Background

- Geometric migration (until 1960)
- Diffraction summation migration (or diffraction stack)
- Finite difference schemes for hyperbolic equations<sup>3</sup>.

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Claerbout, 1971, [13]

Schneider, 1978, [53]



# Background

- Geometric migration (until 1960)
- Diffraction summation migration (or diffraction stack)
- Finite difference schemes for hyperbolic equations<sup>3</sup>.
- **Kirchhoff migration<sup>4</sup>.**

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Claerbout, 1971, [13]

Schneider, 1978, [53]

# Background

- Reverse time migration<sup>5</sup>.

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<sup>5</sup>McMechan, 1983, [47]

<sup>6</sup>Bleistein, 1987, [4]

# Background

- Reverse time migration<sup>5</sup>.
- Kirchhoff migration enhanced the amplitudes and phases<sup>6</sup>.

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<sup>5</sup>McMechan, 1983, [47]

<sup>6</sup>Bleistein, 1987, [4]

# Background

- Migration by Fourier transform. (Migration in f-k domain)<sup>7</sup>.

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Stolt, 1978, [59]

Gazdag, 1978, [34]

Gazdag and Sguazzero, 1984, [35]

Stoffa et al, 1990, [58]

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- Migration by Fourier transform. (Migration in f-k domain)<sup>7</sup>.
- Phase shift migration<sup>8</sup>.

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Stoffa et al, 1990, [58]

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- Migration by Fourier transform. (Migration in f-k domain)<sup>7</sup>.
- Phase shift migration<sup>8</sup>.
- Phase shift plus interpolation (PSPI migration)<sup>9</sup>.

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Gazdag, 1978, [34]

Gazdag and Sguazzero, 1984, [35]

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- Migration by Fourier transform. (Migration in f-k domain)<sup>7</sup>.
- Phase shift migration<sup>8</sup>.
- Phase shift plus interpolation (PSPI migration)<sup>9</sup>.
- **Split step migration**<sup>10</sup>.

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Gazdag and Sguazzero, 1984, [35]

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# Background

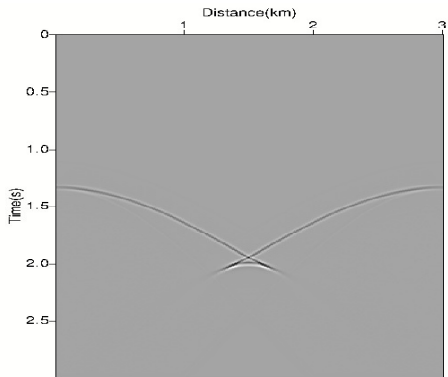
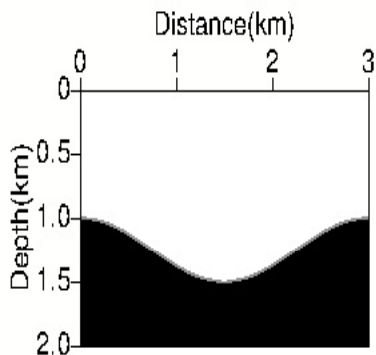
...

In recent years there have been extensions of these methods to three dimensions and pre-stack migration, with further refinements in terms of accuracy and efficiency.



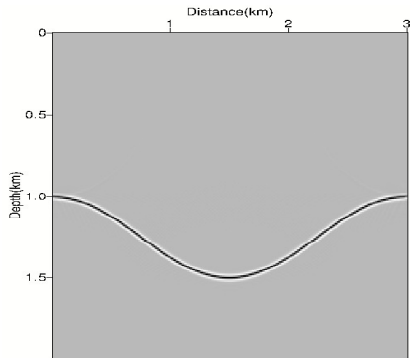
# Examples in migration

## Sinclina model

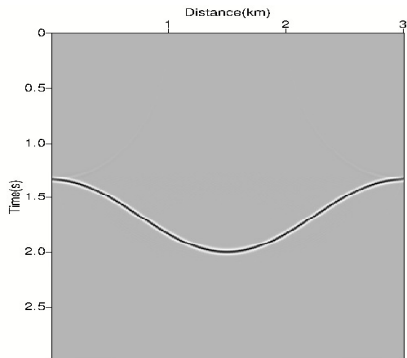


# Examples in migration

## Sinclina model



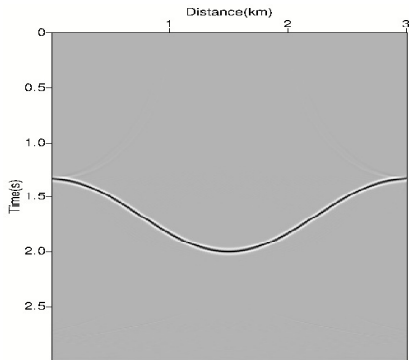
**Finite difference migration**



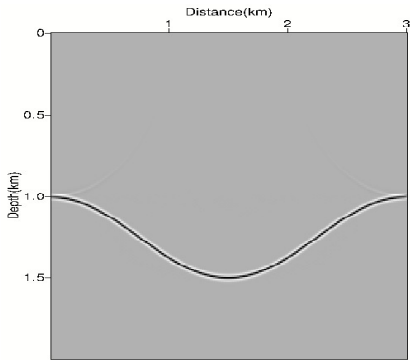
**Fourier migration**

# Examples in migration

## Sinclina model



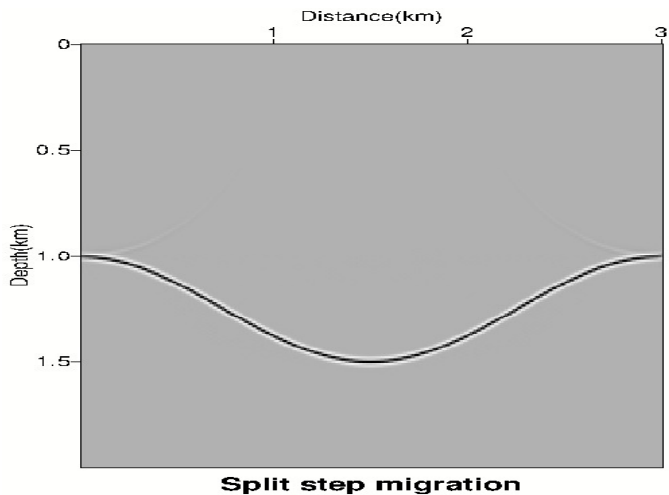
Phase shift migration



Phase shift plus interpolation migration

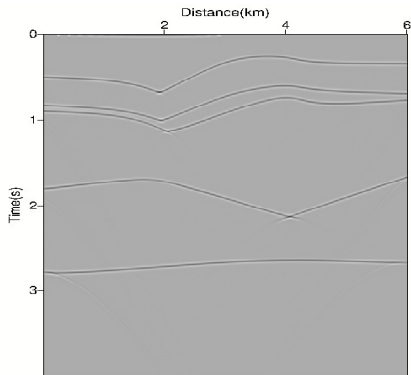
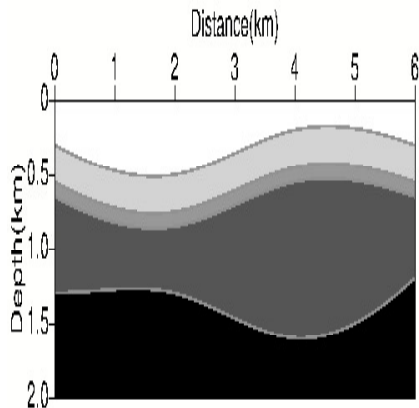
# Examples in migration

## Sinclina model



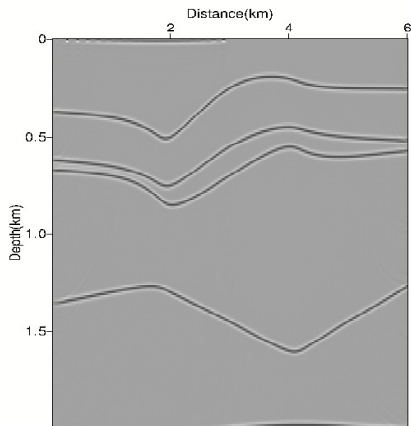
# Examples in migration

## Five layer model

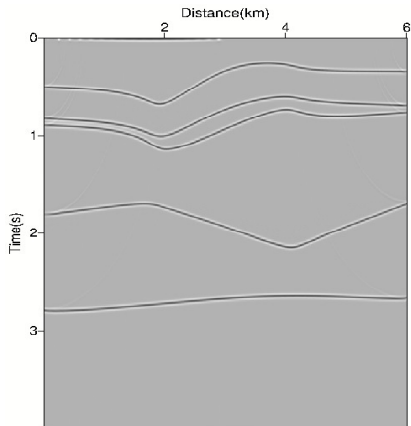


# Examples in migration

## Five layer model



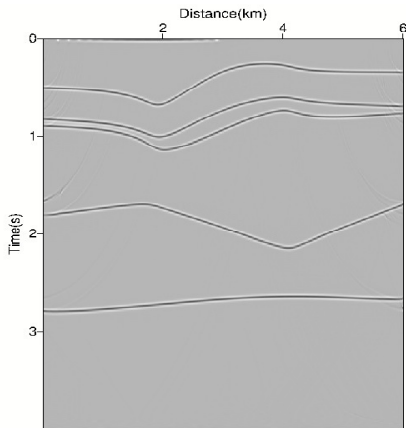
**Finite difference migration**



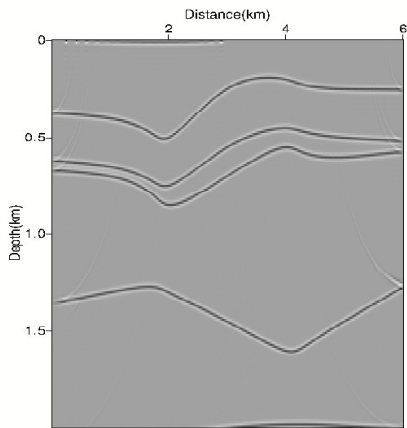
**Fourier migration**

# Examples in migration

## Five layer model



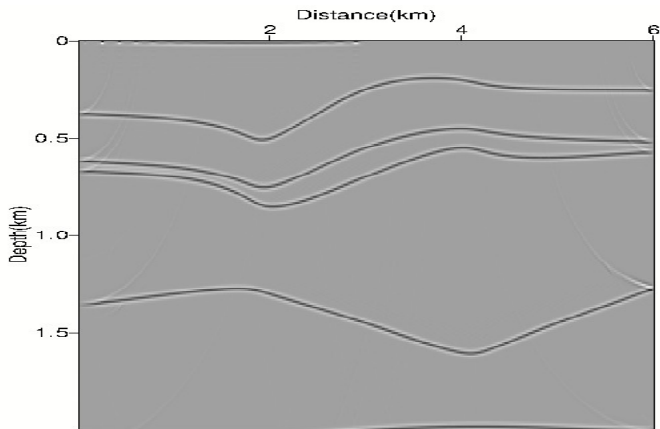
Phase shift migration



Phase shift plus interpolation migration

# Examples in migration

## Five layer model

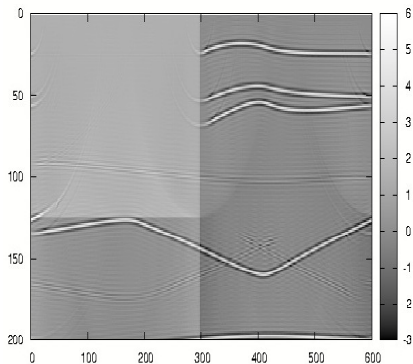


**Split step migration**

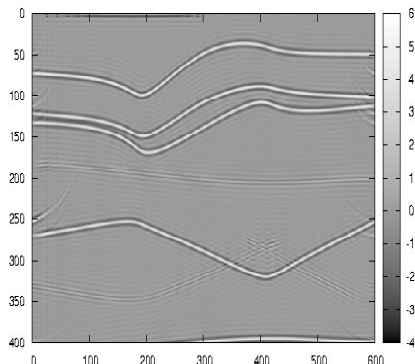


# Examples in migration

## Five layer model



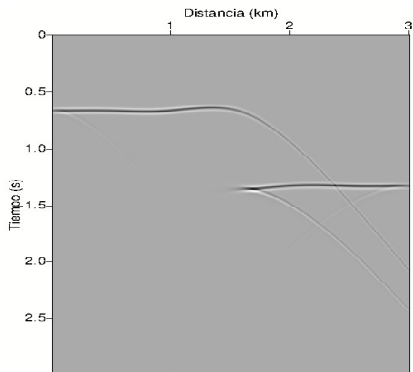
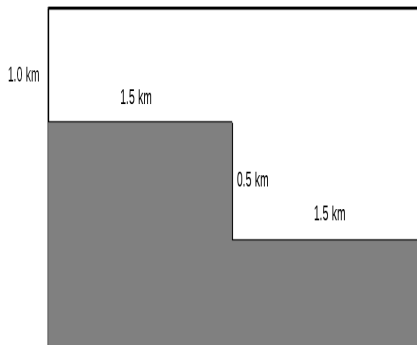
Phase shift migration  $\Delta z = 0.01 \text{ km}$



Phase shift migration  $\Delta z = 0.005 \text{ km}$

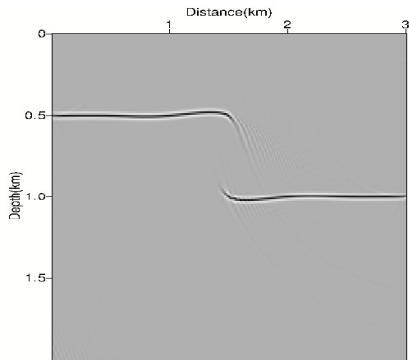
# Examples in migration

## Step model

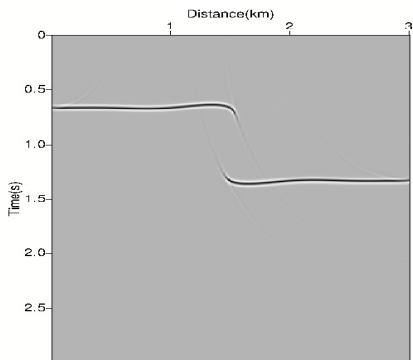


# Examples in migration

## Step model



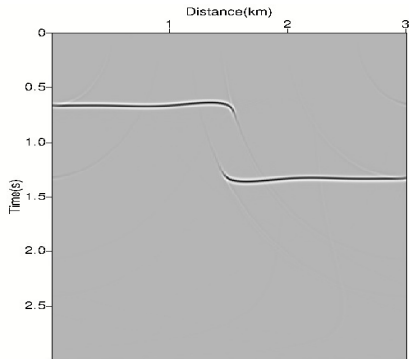
**Finite difference migration**



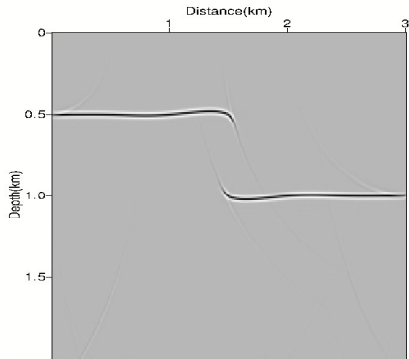
**Fourier migration**

# Examples in migration

## Step model



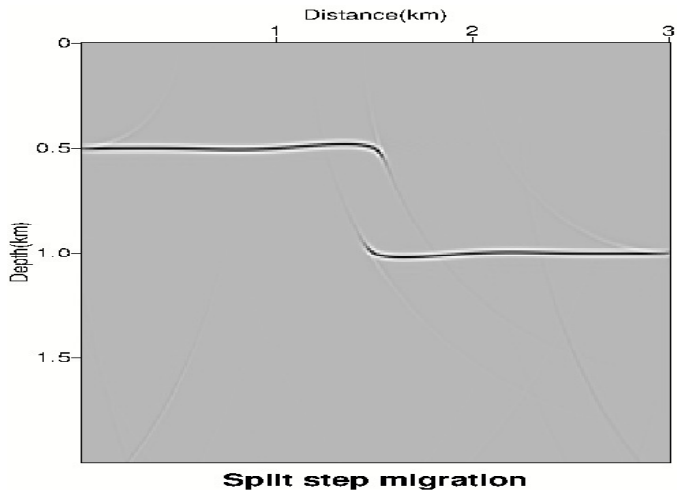
**Phase shift migration**



**Phase shift plus interpolation migration**

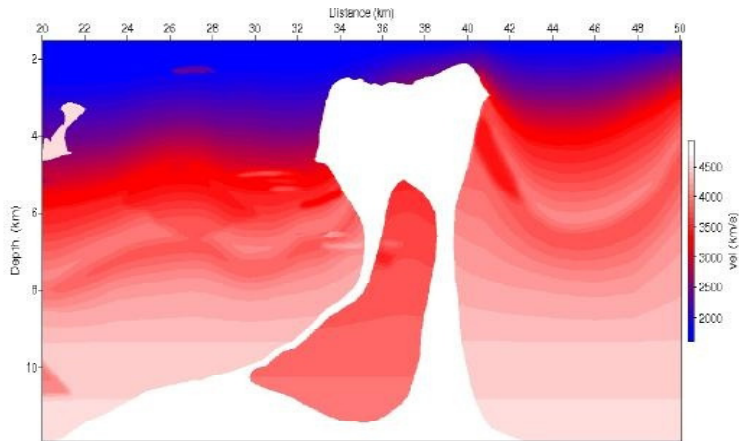
# Examples in migration

## Step model



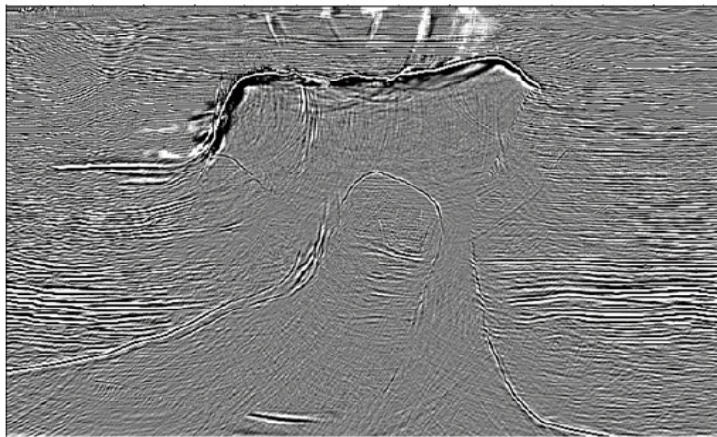
# Examples in migration

## BP model 2007



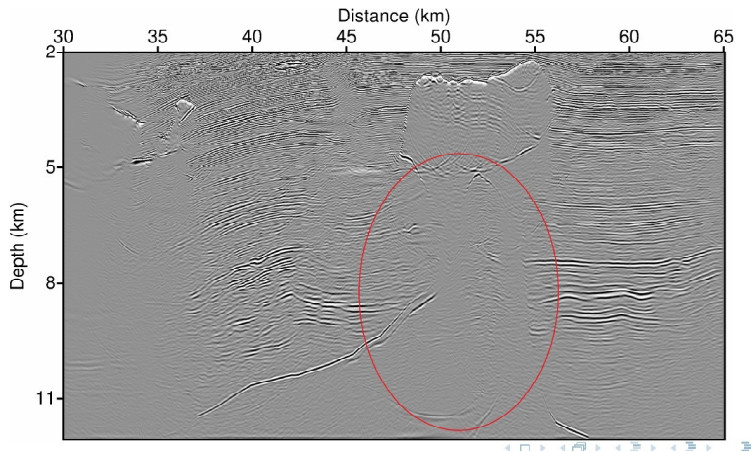
# Examples in migration

## Kirchhoff migration



# Examples in migration

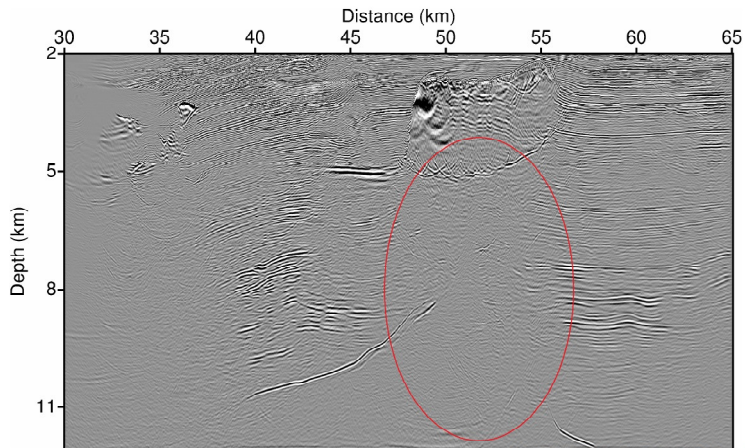
## PSPI migration





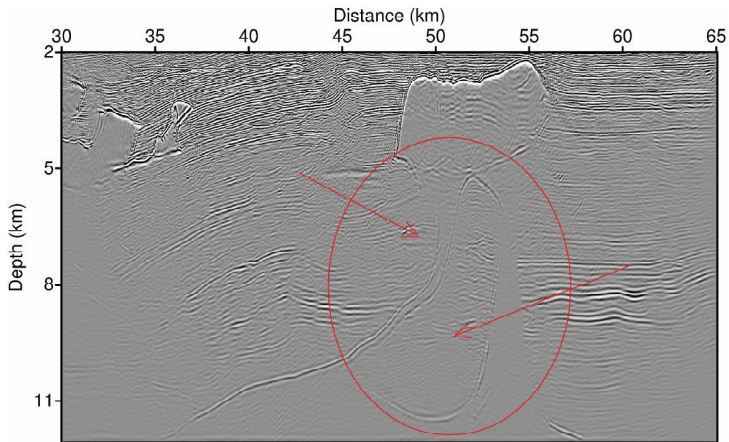
# Examples in migration

## Split-Step migration



# Examples in migration

## RTM migration



# Background

## Wavelet analysis

Methods for the analysis in the frequency-time domain (scale). Analysis of non-stationary signals or strong changes in small intervals.

They are used in:

- Geophysics (Chakraborty, 1995, [9], Foufoula-Georgiou y Kumar, 1995, [28])
- Astrophysics (Starck, 2010, [56])
- Biology (Meyers, 1993, [48])
- Signal and image in Medicine (Burt, 1989, [7], Polikar, 1997, [51])

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## Wavelet analysis

- **Compression fingerprints and images (Bradley, 1993, [6])**
- Satellite images (Demirel, 2010, [16])
- Atmospheric analysis and turbulence (Gamage y Blumen, 1993, [31], Weng y Lau, 1994, [62], Farge, 1992, [26])
- Processing pressure transient signals (Foufoula, 1994, [28])
- Among others

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- **Among others**

# Background

## A brief history

- Gabor transform, 1946<sup>11</sup>.
- Gabor transform modified with dilated Windows<sup>12</sup>.
- Morlet, (1982). Morlet wavelet basis<sup>13</sup>.
- Goupillaud (1984)<sup>14</sup>.

---

Gabor, 1946, [30]

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# Background

## A brief history

- **Orthogonal wavelet transform<sup>15</sup> and pyramid algorithm<sup>16</sup>.**
- Seismic data compression<sup>17</sup> and satellite transmission<sup>18</sup>.
- Emergence of new orthogonal wavelet transforms<sup>19</sup>.

---

Daubechies, 1988, [15]

Mallat, 1989, [45], [46]

Luo et al, 1992, [44], Bosman, 1993, [5]

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# Background

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Luo et al, 1992, [44], Bosman, 1993, [5]

Donoho, 1995, [19], Stigant, 1995, [57]

Candes, 2006, [8], Herrmann, 2007, [42]

# Background

## Wavelets in Meteorology and Oceanography

- Meyers et al <sup>20</sup>.
- Szilagyi et al <sup>21</sup>.
- Chen et al, 1987 <sup>22</sup>.

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1993, [48]

Szilagyi, 1996, [60]

Chen et al, 1997, [11]

# Background

## Wavelets in Meteorology and Oceanography

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Chen et al, 1997, [11]

# Background

## Wavelets in Meteorology and Oceanography

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Szilagyi, 1996, [60]

Chen et al, 1997, [11]

# Background

## Wavelets in Geology and Geophysics

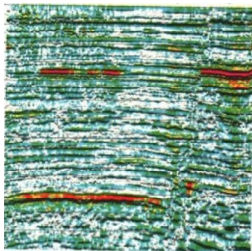
- Complex seismic trace analysis<sup>23</sup>.

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Taner, 1979, [61]

# Background

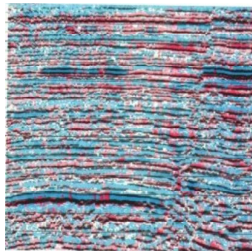
## Wavelets in Geology and Geophysics



Reflection strength



Instantaneous frequency



Apparent polarity

# Background

## Wavelets in Geology and Geophysics

- Complex seismic trace analysis.
- STFT, CWT, MPD <sup>24</sup>.

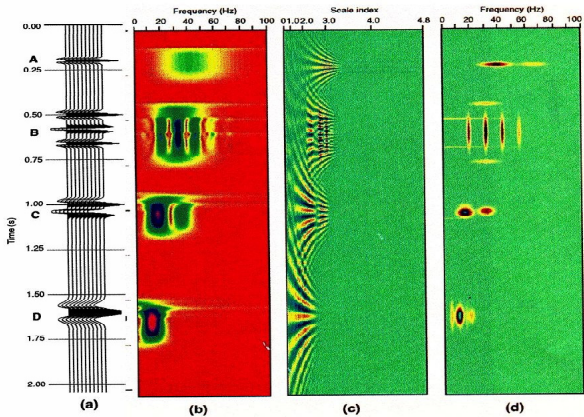
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Chakraborty and Okaya, 1995, [9]



# Background

## Wavelets in Geology and Geophysics



# Background

## Wavelets in Geology and Geophysics

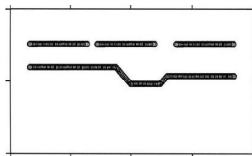
- Complex seismic trace analysis.
- STFT, CWT, MPD.
- Acoustic wavelet transform<sup>25</sup>.

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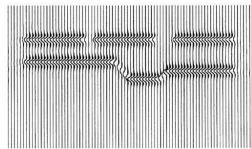
Wu et al, 1998, [66]

# Background

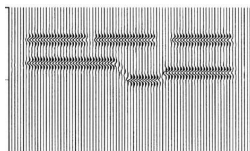
## Wavelets in Geology and Geophysics



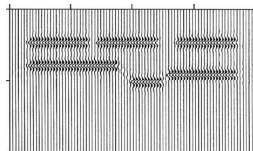
Synthetic model



Daubechies-4



Daubechies-8



Daubechies-12

# Background

## Wavelets in Geology and Geophysics

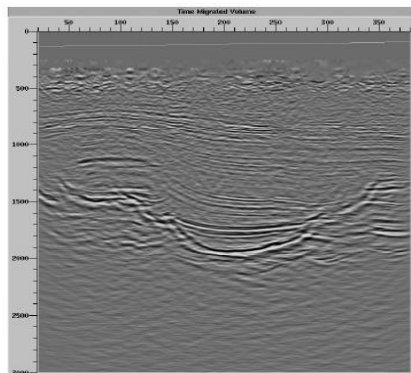
- Complex seismic trace analysis.
- STFT, CWT, MPD.
- Acoustic wavelet transform.
- **Fast Kirchhoff migration<sup>26</sup>.**

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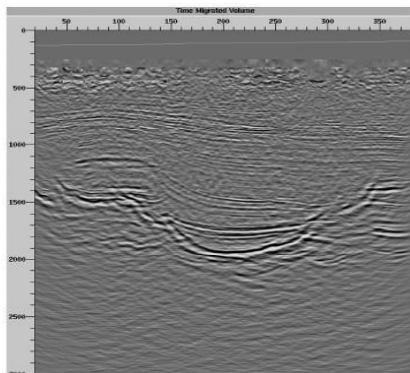
Zheludev, 2002, [69]

# Background

## Wavelets in Geology and Geophysics



Conventional prestack migration



Wavelet prestack migration

# Background

## Wavelets in Geology and Geophysics

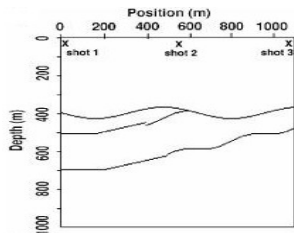
- Prestack multiscale Kirchhoff migration<sup>27</sup>.

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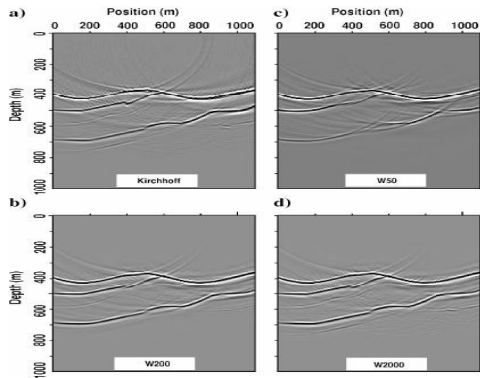
Yu et al, 2004, [67]

# Background

## Wavelets in Geology and Geophysics



Reflectivity model



Migrated image

# Background

## Wavelets in Geology and Geophysics

- Prestack multiscale Kirchhoff migration.
- **Beamlet prestack depth migration<sup>28</sup>.**

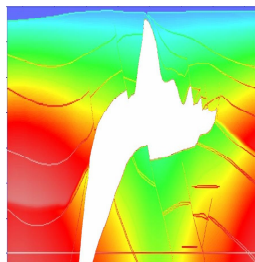
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Chen et al, 2004, [12]

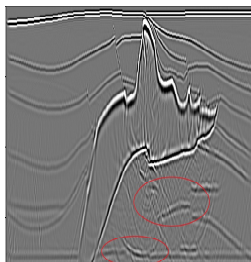


# Background

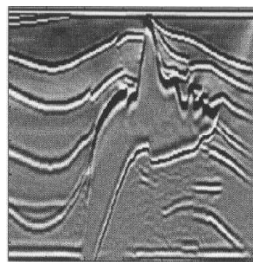
## Wavelets in Geology and Geophysics



SEG-EAGE salt model



Split step migration



Beamlet prestack depth migration

# Background

## Wavelets in Geology and Geophysics

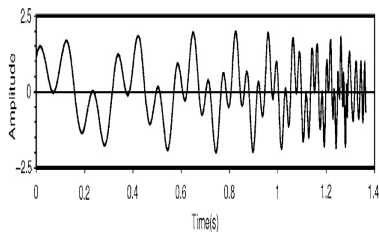
- Prestack multiscale Kirchhoff migration.
- Beamlet prestack depth migration.
- Time frequency continuous wavelet transform TFCWT<sup>29</sup>.

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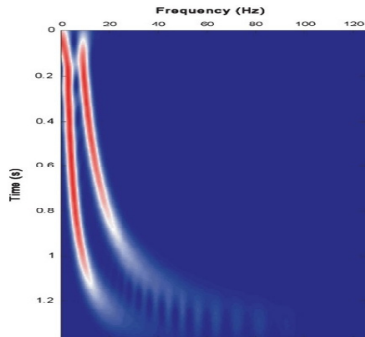
Sinha et al, 2005, [55]

# Background

## Wavelets in Geology and Geophysics



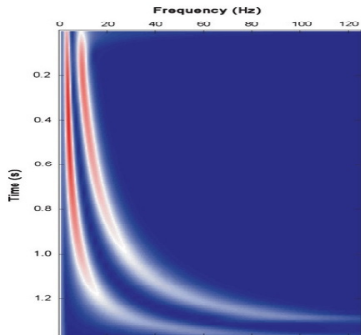
Chirp signal



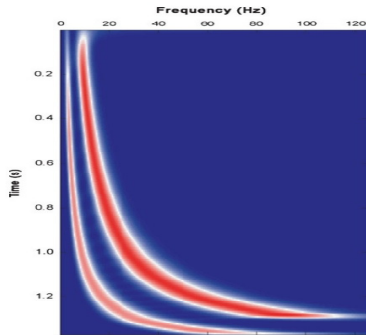
SFFT spectrum

# Background

## Wavelets in Geology and Geophysics



CWT spectrum



TFCWT spectrum

# Background

## Wavelets in Geology and Geophysics

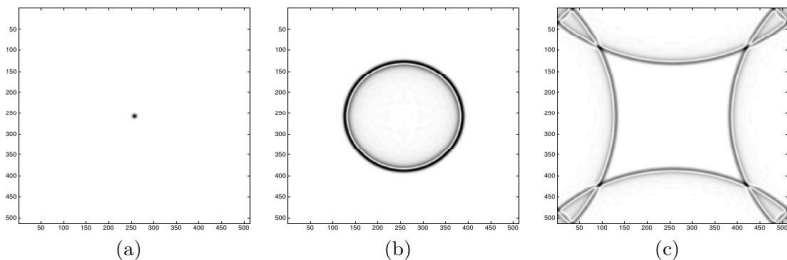
- Fast discrete curvelet transform<sup>30</sup>.

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Candes et al, 2006,[8]

# Background

## Wavelets in Geology and Geophysics



a) Delta function b) Approximate solution at  $t = 0.25s$  c) Approximate solution at  $t = 0.75s$

Image size	$T_{Fwd}(s)$	$T_{Adj}(s)$	$T_{Inv}(s)$	$T_{Fwd}/T_{FFT}$	$\ell^2$ error
$128 \times 128$	0.088832	0.091578	1.006522	24.6756	$1.4430e-06$
$256 \times 256$	0.376838	0.390533	4.002353	19.0322	$8.8154e-07$
$512 \times 512$	2.487052	2.579102	35.09599	18.2202	$5.3195e-07$
$1024 \times 1024$	16.47702	16.87764	129.3631	28.9579	$3.2390e-07$
$2048 \times 2048$	62.42980	65.09365	566.1732	24.1920	$3.4305e-06$

# Background

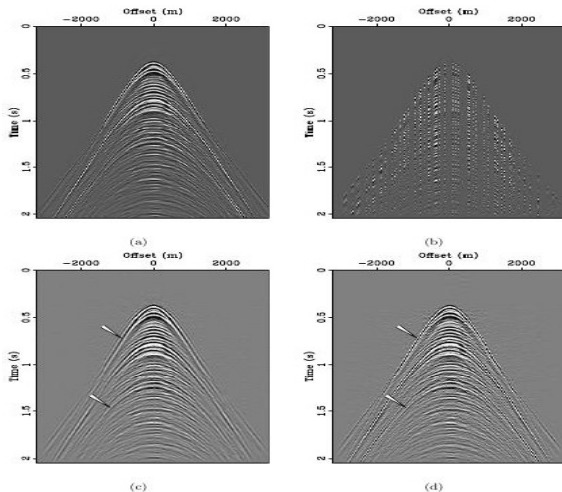
## Wavelets in Geology and Geophysics

- Fast discrete curvelet transform.
- Fast discrete curvelet transform - reconstruct seismic data<sup>31</sup>.

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Herrmann, 2007, [42]

# Background



a) Fully sampled real data shot gather b) Randomly subsampled shot gather with 80% of the traces missing in the receiver and shot directions c) Curvelet-based recovery d) Curvelet-based recovery with focusing



# Background

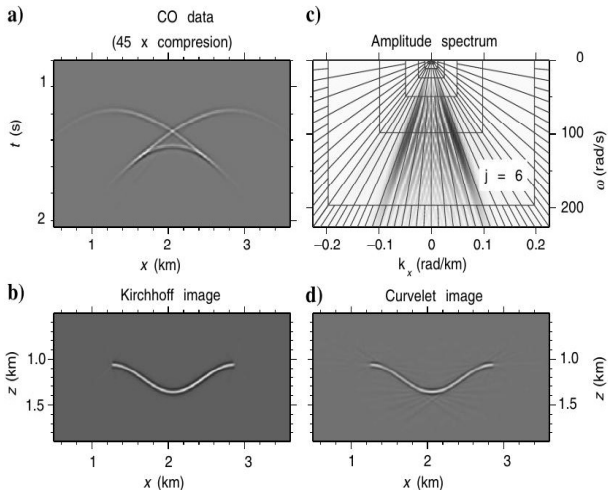
## Wavelets in Geology and Geophysics

- Fast discrete curvelet transform.
- Fast discrete curvelet transform - reconstruct seismic data.
- Zero offset Kirchhoff migration with curvelets<sup>32</sup>.

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Douma and De Hoop, 2007, [20]

# Background



# Background

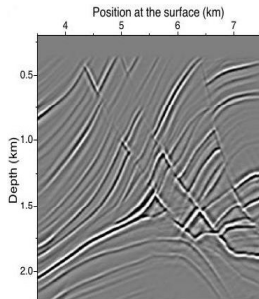
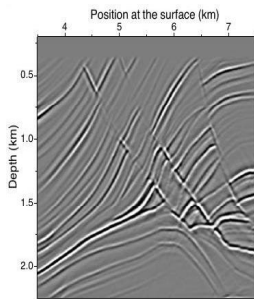
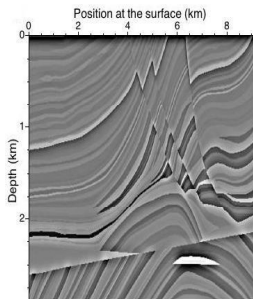
## Wavelets in Geology and Geophysics

- Fast discrete curvelet transform.
- Fast discrete curvelet transform - reconstruct seismic data.
- Zero offset Kirchhoff migration with curvelets.
- **Seismic demigration/migration with curvelets<sup>33</sup>.**

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Chauris and Nguyen, 20098,[10]

# Background



# Current works

- Generation of synthetic seismic data using seismic unix.
- Migration of synthetic seismic data using seismix unix.

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- Forward modeling of acoustic wave equation using finite differences method (second order in time and second order in space).
- Forward modeling of acoustic wave equation using the pseudospectral method (second order in time, second, fourth and sixth order in space).

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- Forward modeling of acoustic wave equation using the pseudospectral method (second order in time, second, fourth and sixth order in space).



# Reverse Time Migration

- Forward propagation
- Backward propagation
- Condition image (cross-correlation)

$$I_{cc}(\mathbf{x}) = \int P_F(\mathbf{x}, t) P_B(\mathbf{x}, t) dt$$

# Reverse Time Migration

## Acoustic wave equation

$$\frac{1}{c^2} \frac{\partial^2 u(\mathbf{x}, t)}{\partial t^2} - \nabla^2 u(\mathbf{x}, t) = s(\mathbf{x}, t) \quad (1)$$

$u(\mathbf{x}, t)$ : Wavefield at time  $t$

$\mathbf{x} = (x, y, z)$ : Position vector

$c = c(\mathbf{x})$ : Acoustic propagation velocity

$s(\mathbf{x}, t)$ : Source term

$\nabla^2 = \left( \frac{\partial^2}{\partial x^2} + \frac{\partial^2}{\partial y^2} + \frac{\partial^2}{\partial z^2} \right)$ : The Laplacian operator in Cartesian coordinates

# Reverse Time Migration

## Finite Difference

Forward propagation (Second order in time and space)

$$U_{i,j}^{n+1} = 2U_{i,j}^n - U_{i,j}^{n-1} + \nu^2 [U_{i+1,j}^n + U_{i-1,j}^n + U_{i,j+1}^n + U_{i,j-1}^n - 4U_{i,j}^n] + S_{i,j}^n \quad (2)$$

with

$$\nu = \frac{c_{i,j} \Delta t}{h} \quad (3)$$

Backward propagation (Second order in time and space)

$$\tilde{U}_{i,j}^{n+1} = 2\tilde{U}_{i,j}^n - \tilde{U}_{i,j}^{n-1} + \nu^2 [\tilde{U}_{i+1,j}^n + \tilde{U}_{i-1,j}^n + \tilde{U}_{i,j+1}^n + \tilde{U}_{i,j-1}^n - 4\tilde{U}_{i,j}^n] + \tilde{S}_{i,j}^n \quad (4)$$

# Reverse Time Migration

## Pseudospectral method

Rewriting the wave equation

$$\frac{\partial^2 u(\mathbf{x}, t)}{\partial t^2} = -L^2 u(\mathbf{x}, t) \quad (5)$$

with

$$-L^2 = c^2(\mathbf{x})\nabla^2$$

The formal solution of the equation 5 with initial conditions  $\frac{\partial u(\mathbf{x}, t)}{\partial t}(t = 0) = \dot{u}_0$  and  $u(\mathbf{x}, t = 0) = u_0$  is given by

$$u(\mathbf{x}, t) = \cos(Lt)u_0 + L^{-1} \sin(Lt)\dot{u}_0 \quad (6)$$

# Reverse Time Migration

The wavefields  $u(\mathbf{x}, t + \Delta t)$  and  $u(\mathbf{x}, t - \Delta t)$  can be evaluated by equation 6. Adding these two wavefields result is

$$u(\mathbf{x}, t + \Delta t) + u(\mathbf{x}, t - \Delta t) = 2 \cos(L\Delta t)u(\mathbf{x}, t) \quad (7)$$

If we take for  $\cos(L\Delta t)$  its second-order  $(1 - \frac{(L\Delta t)^2}{2})$  Taylor-series expansion, we obtain

$$u(\mathbf{x}, t + \Delta t) - 2u(\mathbf{x}, t) + u(\mathbf{x}, t - \Delta t) = -\Delta t^2 L^2 u(\mathbf{x}, t) \quad (8)$$

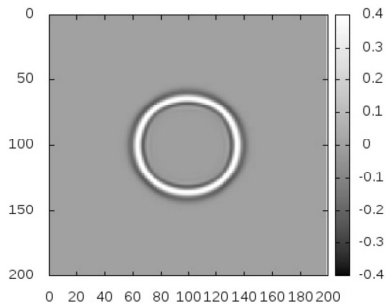
# Reverse Time Migration

Using a pseudospectral method (Etgen, 1986 [24], Zhang et al., 2007 [68]) for the spatial derivatives, we can express equation 8 as:

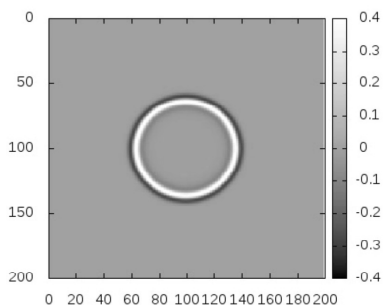
$$u(\mathbf{x}, t + \Delta t) - 2u(\mathbf{x}, t) + u(\mathbf{x}, t - \Delta t) = \Delta t^2 [c^2(\mathbf{x}) FT^{-1} (k_x^2 + k_y^2 + k_z^2) FT] u(\mathbf{x}, t)$$

# Reverse Time Migration

## Snapshot at 6 s



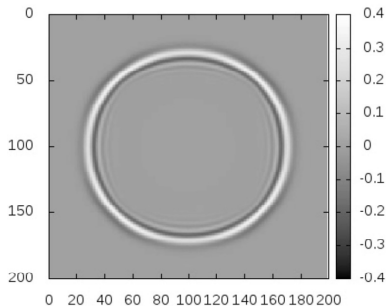
Finite difference



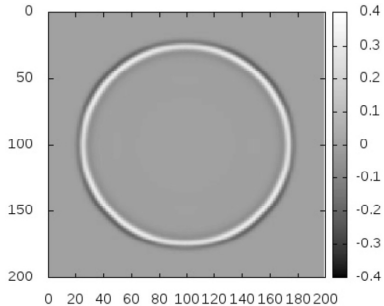
Pseudospectral

# Reverse Time Migration

Snapshot at 12 s



Finite difference



Pseudospectral



# Current works

Finite difference method

<https://youtu.be/rhCRqaEHXqA>

Pseudospectral method

<https://youtu.be/5M0mgKzpk>

# Current works

- Discrete approximation of a function using the Haar system.

# Current works

## Haar system

$$f(x) = \sum_{k=0}^{2^J-1} a_{J,k} p_{J,k}(x) + \sum_{j=J}^{\infty} \sum_{k=0}^{2^j-1} b_{j,k} h_{j,k}(x) \quad (9)$$

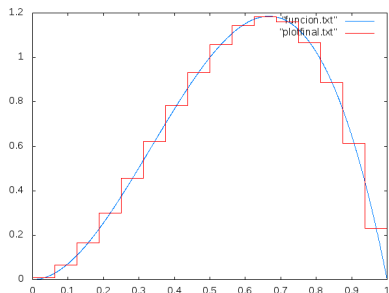
where

$$a_{J,k} = \langle f, p_{J,k} \rangle$$

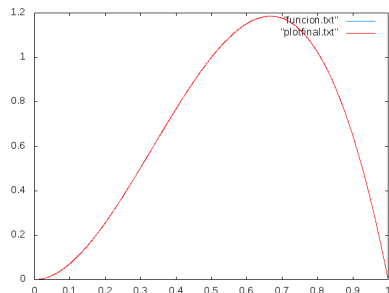
$$b_{j,k} = \langle f, h_{j,k} \rangle$$

# Current works

## Haar system



$$f(x) = 8x(1 - x); J = 0, j = 3$$



$$f(x) = 8x(1 - x); J = 0, j = 15$$

# Current works

- Discrete approximation of a function using the Haar system.
- C language implementation for Phase shift migration.

# Phase shift Migration

2D acoustic wave equation

$$\frac{\partial^2 P}{\partial z^2} + \frac{\partial^2 P}{\partial x^2} - \frac{1}{c^2} \frac{\partial^2 P}{\partial t^2} = 0 \quad (10)$$

Applying the Fourier transform to the equation 10 we have

$$\frac{\partial^2 P}{\partial z^2} + \left( \frac{\omega^2}{c^2} - k_x^2 \right) P = 0 \quad (11)$$

Let  $A^2 = \frac{\omega^2}{c^2} - k_x^2$

# Phase shift Migration

Then

$$\left( \frac{\partial^2}{\partial z^2} + A^2 \right) P = 0 \quad (12)$$

$$\left( \frac{\partial}{\partial z} + iA \right) \left( \frac{\partial}{\partial z} - iA \right) P = 0 \quad (13)$$

If  $c = c(z)$  but each subinterval  $[z_i, z_{i+1}]$  is to be  $c(z) = \text{constant}$ , then we can solve the equation 13.

Then

$$\frac{\partial}{\partial z} P(k_x, z, \omega) = -i \sqrt{\frac{\omega^2}{c^2} - k_x^2} P(k_x, z, \omega) \quad (14)$$

# Phase shift Migration

The equation to extrapolate the wavefield is

$$P(\omega, k_x, z + \Delta z) = P(\omega, k_x, z)e^{-ik_z\Delta z} \quad (15)$$

where

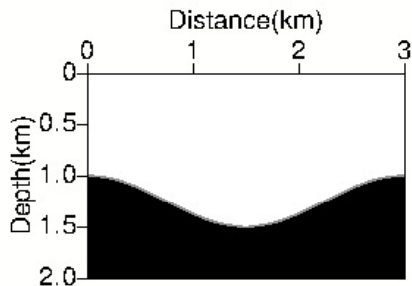
$$k_z = \sqrt{\frac{\omega^2}{c^2} - k_x^2}$$

The migrated section on each  $z + \Delta z$  level is given by (image condition at  $t = 0$ )

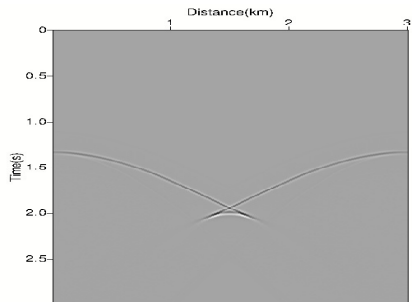
$$P(x, z + \Delta z) = \int d\omega \int P(\omega, k_x, z)e^{-ik_z\Delta z} e^{-ik_x x} dk_x \quad (16)$$



# Phase shift Migration

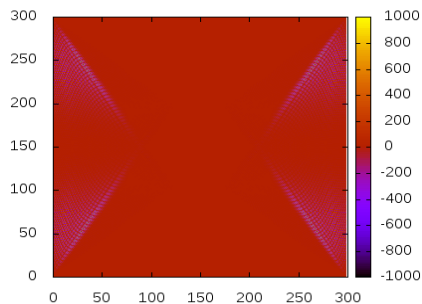


Sinclina model

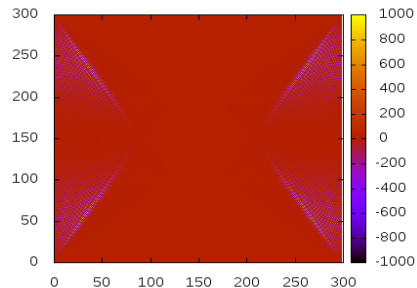


Seismic section

# Phase shift Migration

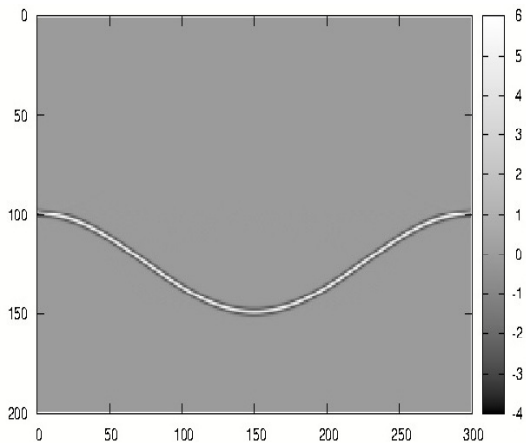


Real part of the spectrum



Imaginary part of the spectrum

# Phase shift Migration



# Current works

- Discrete approximation of a function using the Haar system.
- C language implementation for Phase shift migration.
- Analyze and study the possibility of implementing the phase shift migration using the discrete wavelet transform with the system haar

# Work perspectives

- Is it possible to calculate the Laplacian (2D, 3D) using a different method that does not use a finite differences scheme or pseudo-spectral?
- Is it possible to improve the dispersion in wave propagation using a different method to calculate the Laplacian (2D, 3D), for example, a wavelet transform or another transform?
- Is it feasible to find other 2D, 3D orthogonal transformation that can be used in another method of migration, such as reverse time migration, allowing improve the images obtained through the analysis of the signals recorded on the surface?
- Search for a methodology to find the subsurface velocity field (2D, 3D) through the analysis of the signals recorded on the surface.

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