Velocity Model Sampling and Interpolation: The Gradient Problem

> Marcus R. Wilson

Outline

**Ray Tracing** 

Regression

Results

Conclusions

# Velocity Model Sampling and Interpolation: The Gradient Problem

Marcus R. Wilson

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**3** Regression

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### Motivation

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Kirchhoff migration uses raytracing equations for prestack depth migration.

$$\frac{d\vec{x}}{dt} = v(\vec{x})^2 \vec{p} \qquad \frac{d\vec{p}}{dt} = -\frac{\nabla v(\vec{x})}{v(\vec{x})} \tag{1}$$

These equations estimate the paths of seismic energy through the subsurface as a function of a known velocity model and its gradient.

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### Motivation



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- Velocity models are generally smoothed before Kirchhoff migration.
- Moser (2011) Uses a smoothed velocity model to compute raypaths, and then computes traveltimes using the original blocky model.
- The result is a sharper image with more continuous reflectors than using the smooth model everywhere.

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Snell's Law

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# Regression

Processing delivers a velocity model sampled on a grid:

- Rays travel between these nodes, so we need to interpolate
- Sampling of the velocity grid makes it hard to accurately compute gradient vectors
- Some sort of regression would be ideal!

$$v(x,z) = \sum_{k=1}^{N} \alpha_k \tilde{v}_k(x,z)$$
(4)

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### We can easily construct infinitely many basis functions:

- Dipping layers
- Anticlines
- Salt structures
- Random functions

### ${\sf Key \ Observation}:$

- The dipping layers are invariant from trace to trace except for a constant dip.
- This is the same assumption Spitz interpolation works on.

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Regression

### Spitz Method

• Model the traces as a sum of L events with constant dip

$$g_n(k_z) = \sum_{j=1}^{L} G_j(k_z) e^{2\pi i k_z (n-1) d_j}$$

- Unknown *d<sub>i</sub>* gives the dip of the event.
- Interpolate between known traces using PEFs, or solve for d<sub>i</sub> directly.

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### Caveats

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• Velocity models are not band limited in z.

• For multiple dipping layers, this is a multiple nonlinear regression problem.

For a single dipping interface, this is a simple linear regression, so we can recover the dip directly by least-squares.

$$\log \left(g_n(f)\right) = \log \left(G_1(k_z)\right) 2\pi i k_z (n-1) d_1$$

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 $2\pi i k_{z} (n-1) \log(g_{1}(k_{z}))$ 

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Results
Percentered $d = 0.7970$
• Recovered $a_1 = 0.7670$
• Actual dip is $-2.3571$ (difference of $\pi$ radians)

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# Conclusions

- Velocity model interpolation is similar to seismic interpolation.
- Nonlinear regression may be able to recover multiple dipping events.

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### Future work

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- Implement seismic interpolation techniques to upsample velocity models for better lateral continuity and gradients.
- Use accurate gradients to perform Kirchhoff migration, to see if we can improve on the results of Moser (2011).

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#### Velocity Model Sampling and Interpolation: The Gradient Problem

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- Outline
- Motivatio
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- Regression
- Results
- Conclusions

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