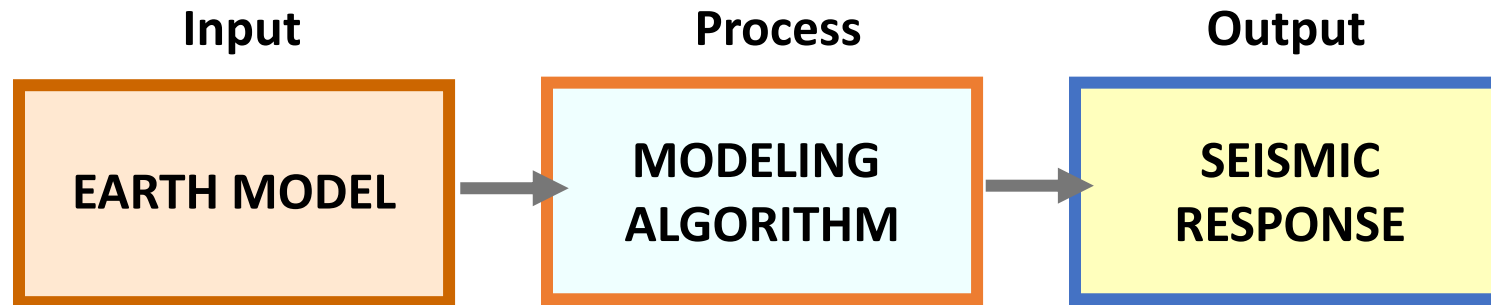


# Chapter 3

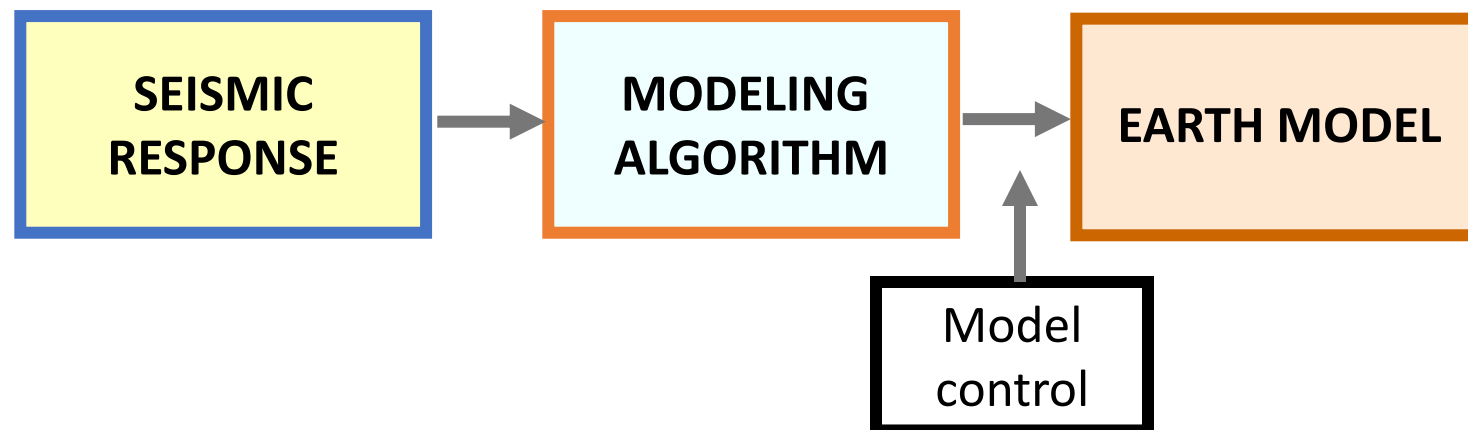
## INVERSION THEORY

# What is Inversion?

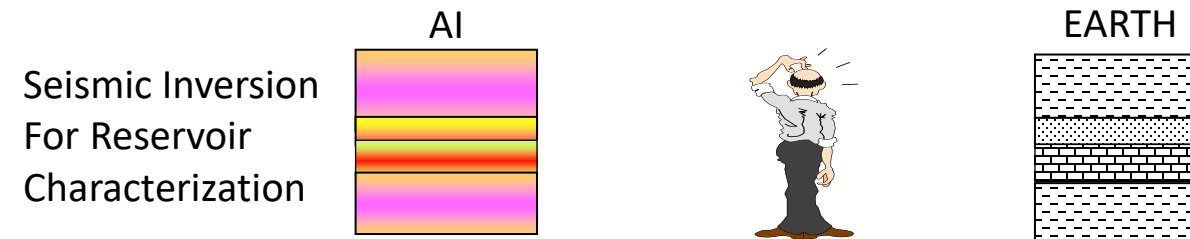
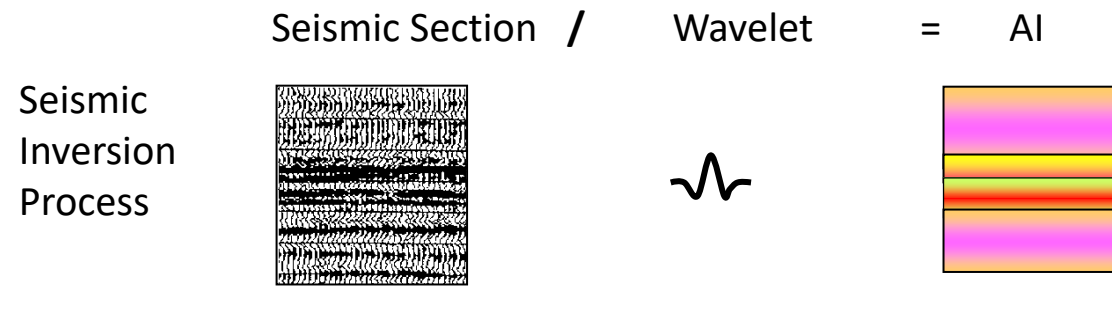
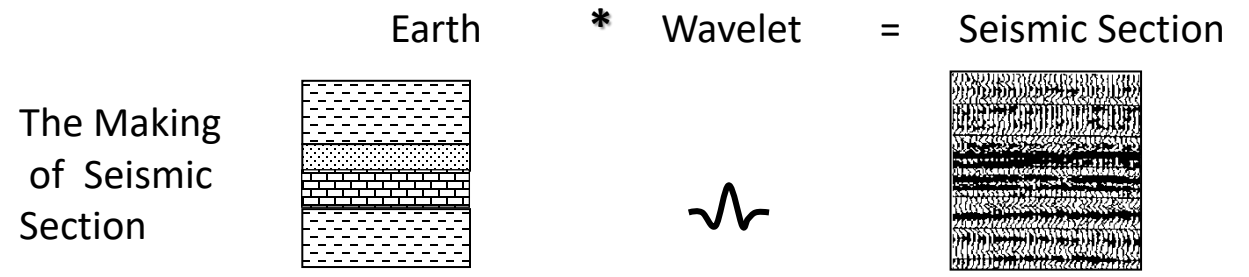
## *Forward modeling*



## *Inverse modeling*



# What is Inversion?



# Inversion Methods

- Post-Stack:
  - Trace Integration
  - Colored Inversion
  - Band-limited
  - Sparse Spike
  - Model based
- Pre-Stack:
  - AVO Inversion
  - Sparse Spike
  - Model based
- Neural nets
- Stochastic Inversion

# Classic approach of seismic trace based inversion

Reflectivity  $R$  at interface of two layers denoted as 1 and 2 is related to the Acoustic Impedance  $I$  of these layers:

- $$R = (I_2 - I_1) / (I_1 + I_2)$$

If the acoustic impedance of the first layer is known the acoustic impedance of the subsequent layers can be calculated recursively from the reflectivity:

- $$I_{n+1} = I_n * (1 + R_n) / (1 - R_n)$$

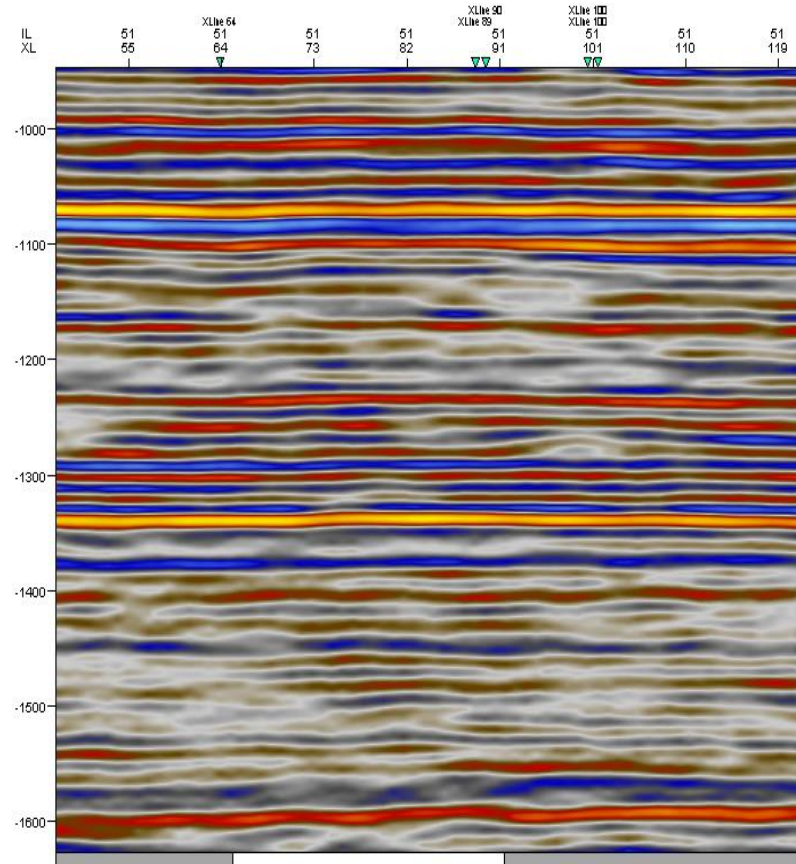
After some manipulation you get

$$I_n = I_0 \exp\left[2 \int_0^t R(t) dt\right]$$

# Inversion Methods

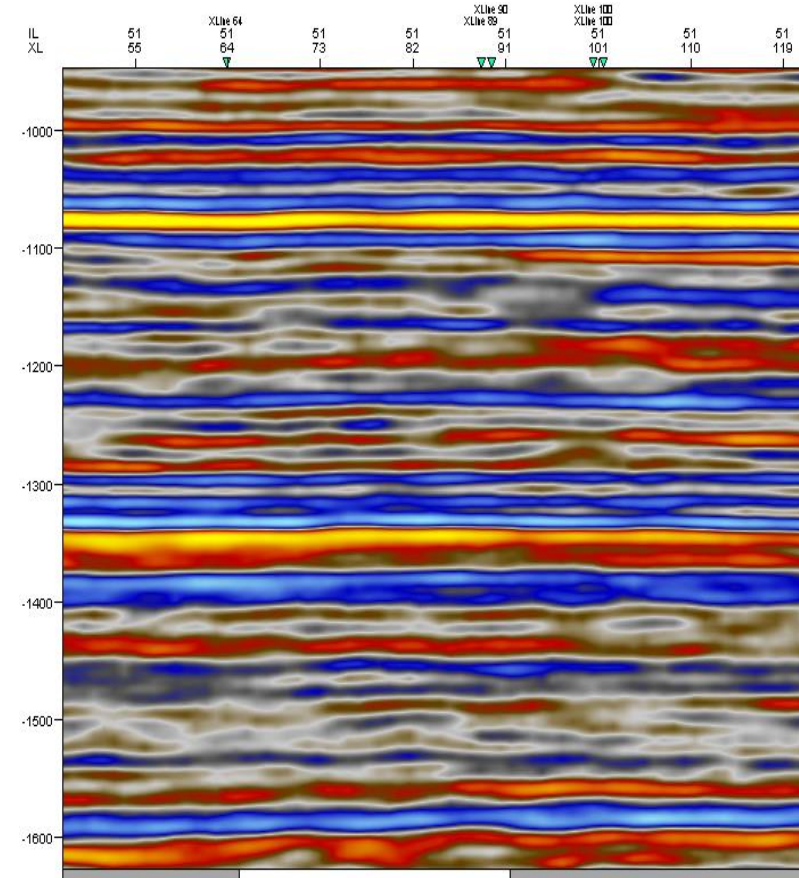
## Trace Integration

**Input seismic data**



Amplitude

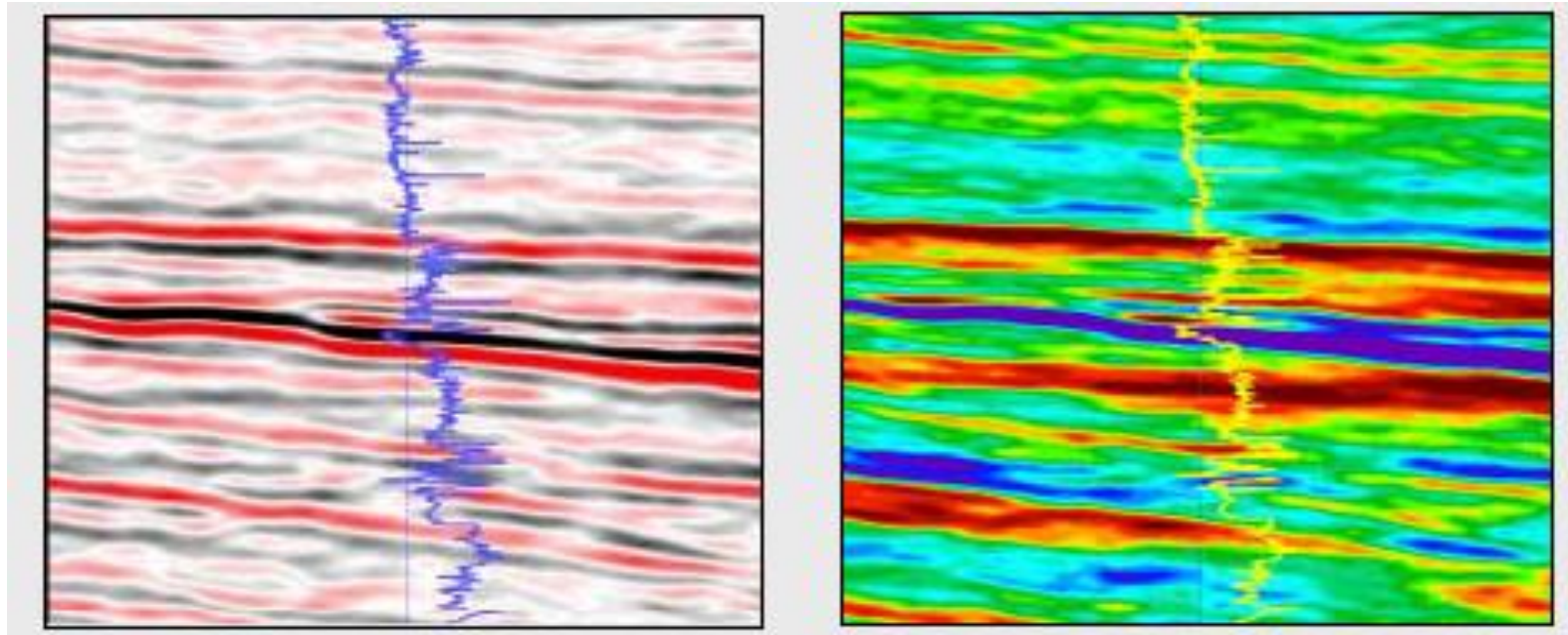
**Trace integration inversion**



Relative Acoustic Impedance (RAI)

# Inversion Methods

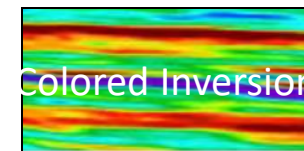
## Colored Inversion



Amplitude Spectrum of well log

compared

Amplitude Spectrum of seismic



# Colored inversion

## Principle:

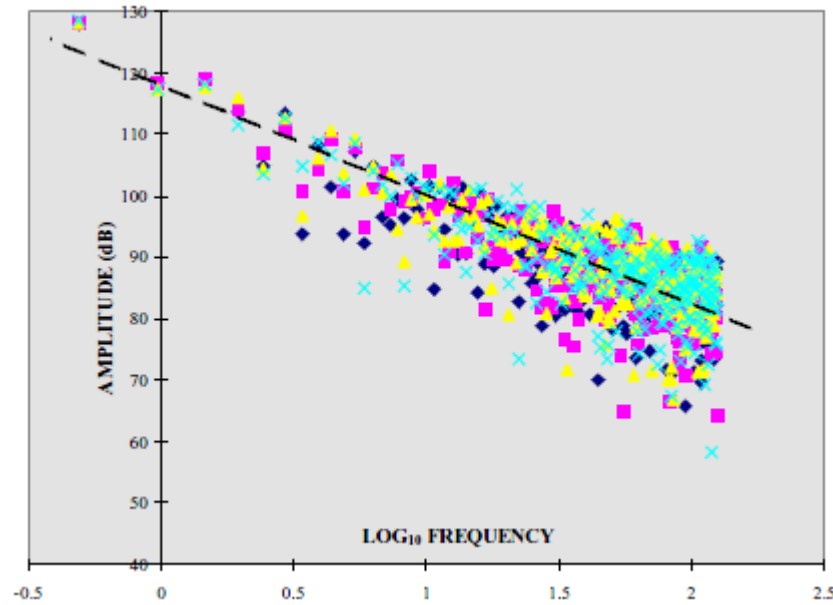
The various seismic and well log spectra are analysed to define an operator that shapes the average seismic trace spectrum to that of a fitted smooth curve which is representative of the average Reflectivity log spectrum. This defines the amplitude spectrum of the required operator. Theory tells us that a 90 degree phase rotation is also required.

The assumption is that the input seismic data is zero phase. The Coloured Inversion operator is converted to the time domain and simply applied to the seismic volume using a convolution algorithm.

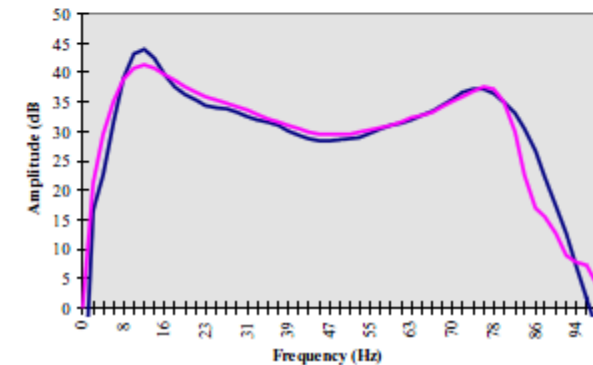
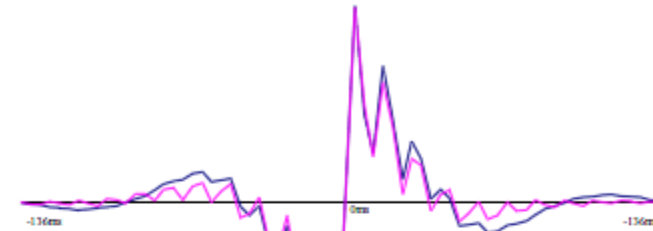
# Colored Inversion

- Colored Inversion enables the **rapid** inversion of 3D data.
- A single convolutional inversion operator is derived that optimally inverts the data and honours available well data in a global sense.
- The process is inherently stable and broadly consistent with known AI behaviour in the area.
- Construction of the operator is a simple process
- No explicit wavelet is required other than testing for a residual constant phase rotation as the last step since zero phase wavelet is assumed

# Colored inversion – match logs and seismic



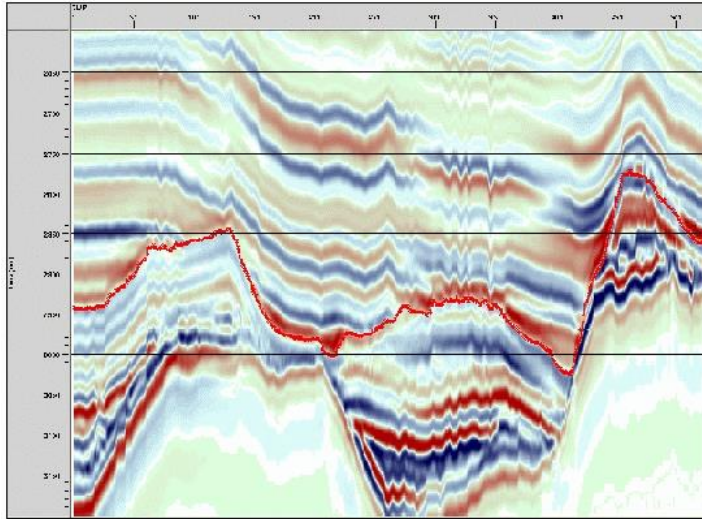
Four AI logs from a North Sea field are displayed on a log-frequency axis to demonstrate the linear trend, equivalently exponential on a linear frequency axis. The gradient of the linear fit determines  $\alpha$ .



Comparison of the matching operator (pink) and the Coloured Inversion operator (dark blue).

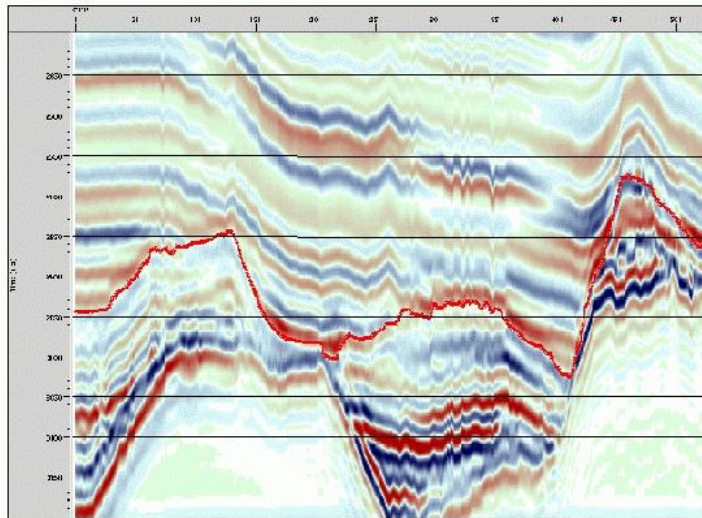
*Lancaster & Whitcombe, 2000*

# Comparison between synthetic, sparse spike and colored inversion

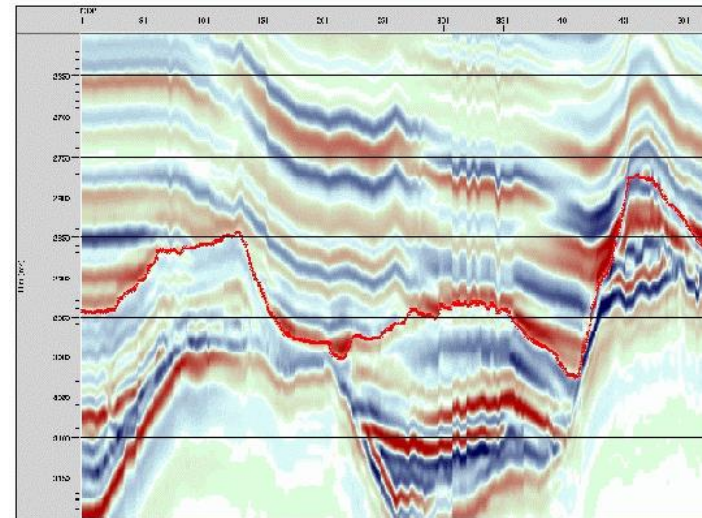


Benchmark dataset - 'the answer'

*Lancaster & Whitcombe,  
2000*

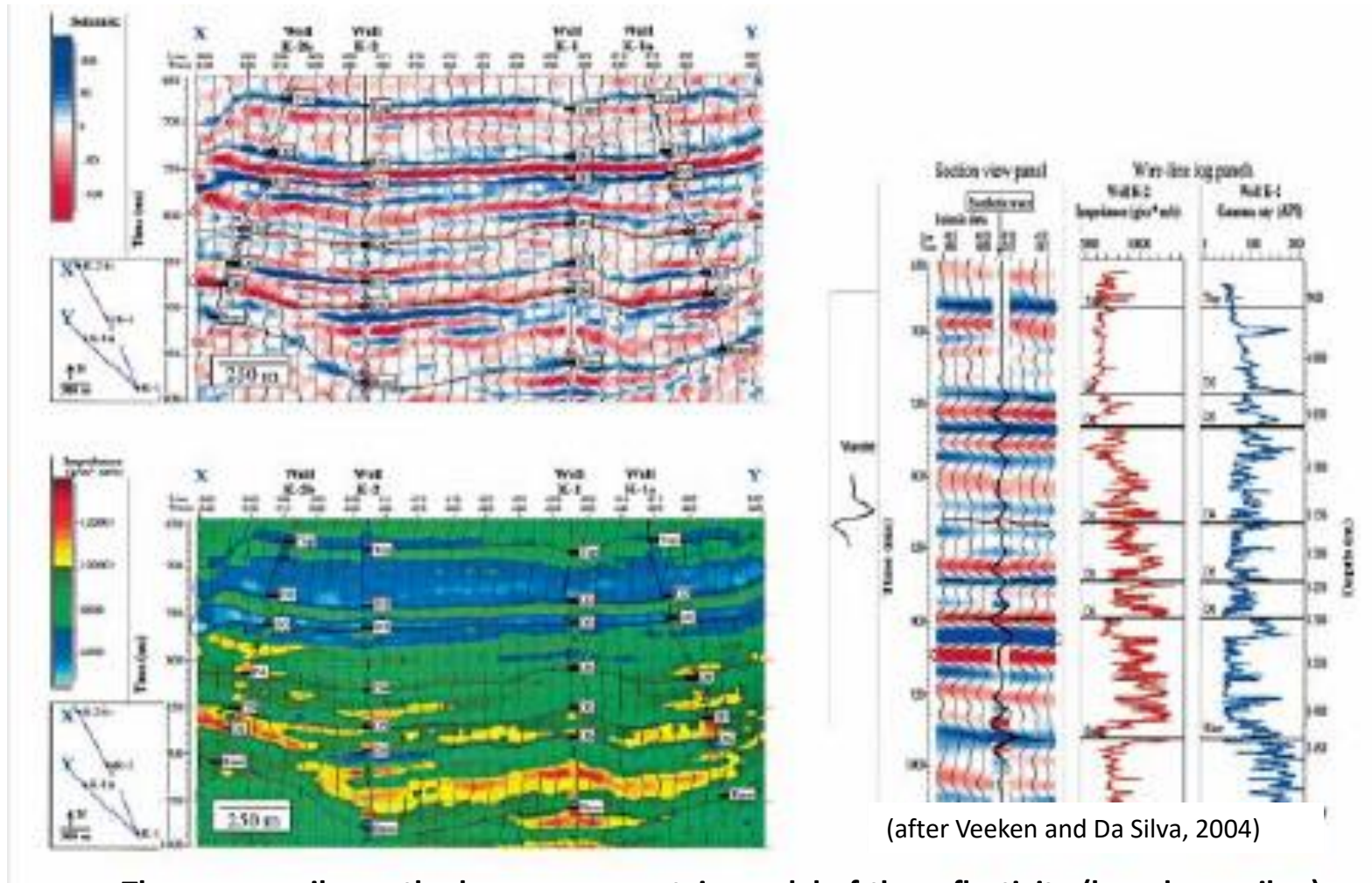


Unconstrained Sparse-Spike Inversion



Coloured Inversion

# Sparse-Spike Inversion Method



(after Veeken and Da Silva, 2004)

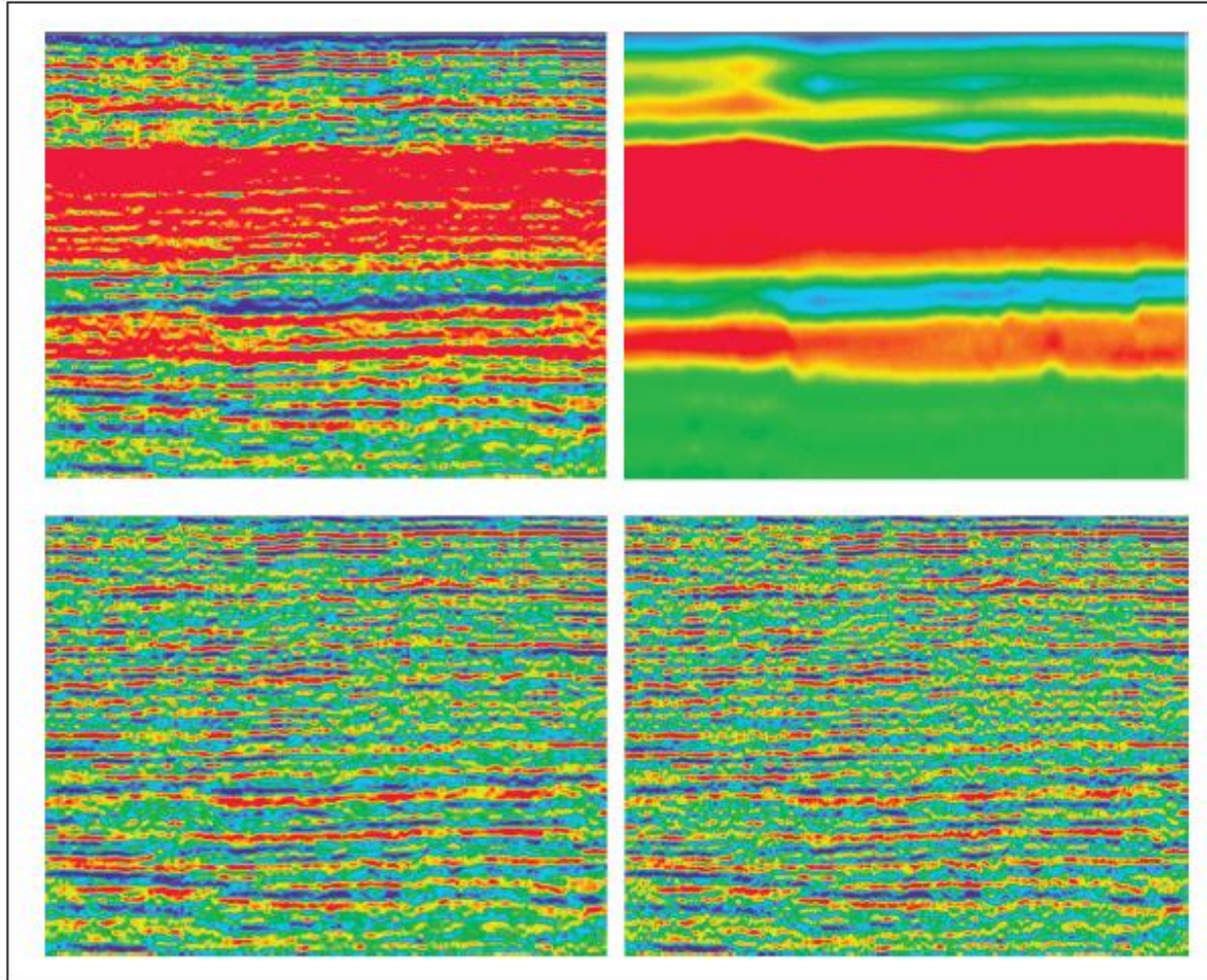
The sparse-spike method assumes a certain model of the reflectivity (based on spikes) and makes a wavelet estimate based on this model assumption.

# Sparse-Spike Inversion Method

- Sparse-spike inversion assumes that only the big/significant spikes are important.
- Reflectivity series reconstruct one spike each at a time. The spike are added until the trace is modeled accurately.
- The sparse-spike inversion use the same parameter as the model-based inversion with constraint.

# Example of sparse spike inversion (*Francs 2006*)

## *How to QC the sparse spike inversion*



Top left: Sparse spike inversion

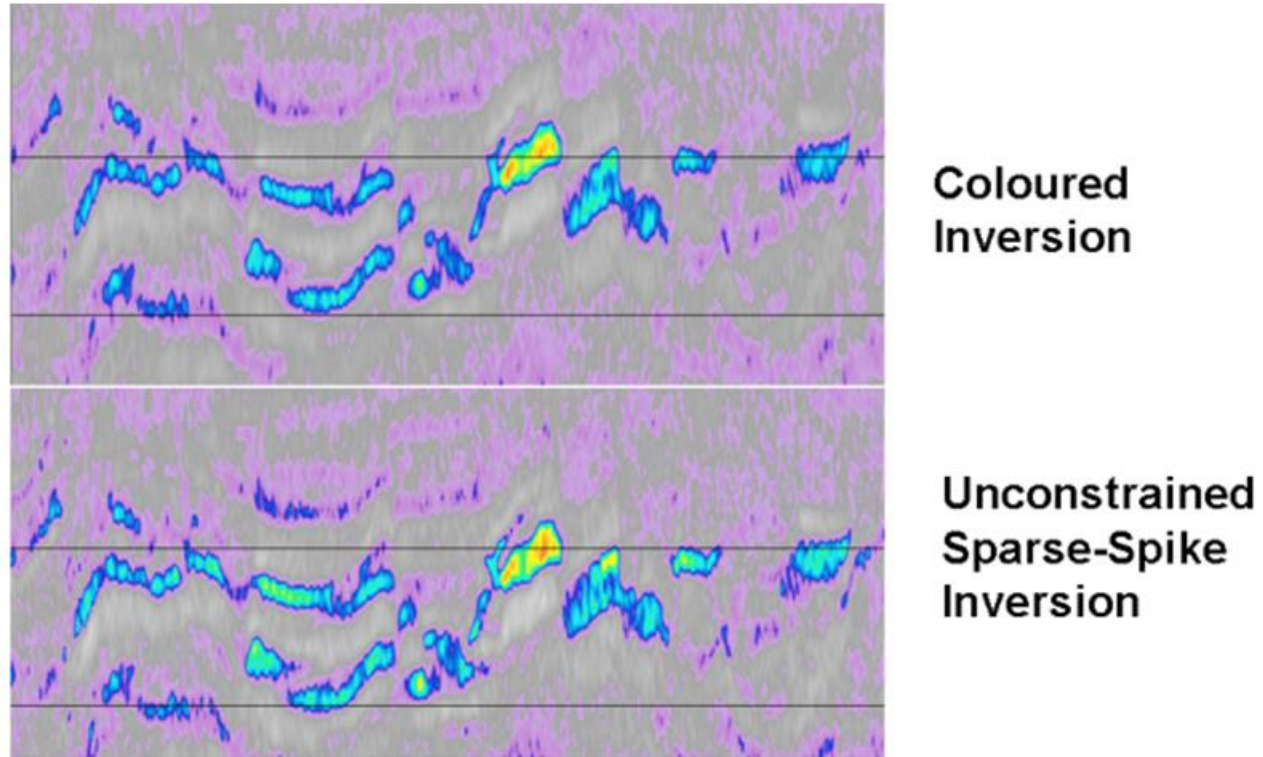
Top right: Low pass filtered sparse spike inversion

Low left: High pass filtered inversion

Low right: Relative acoustic impedance

Note: high frequency component of sparse spike inversion similar to relative acoustic impedance

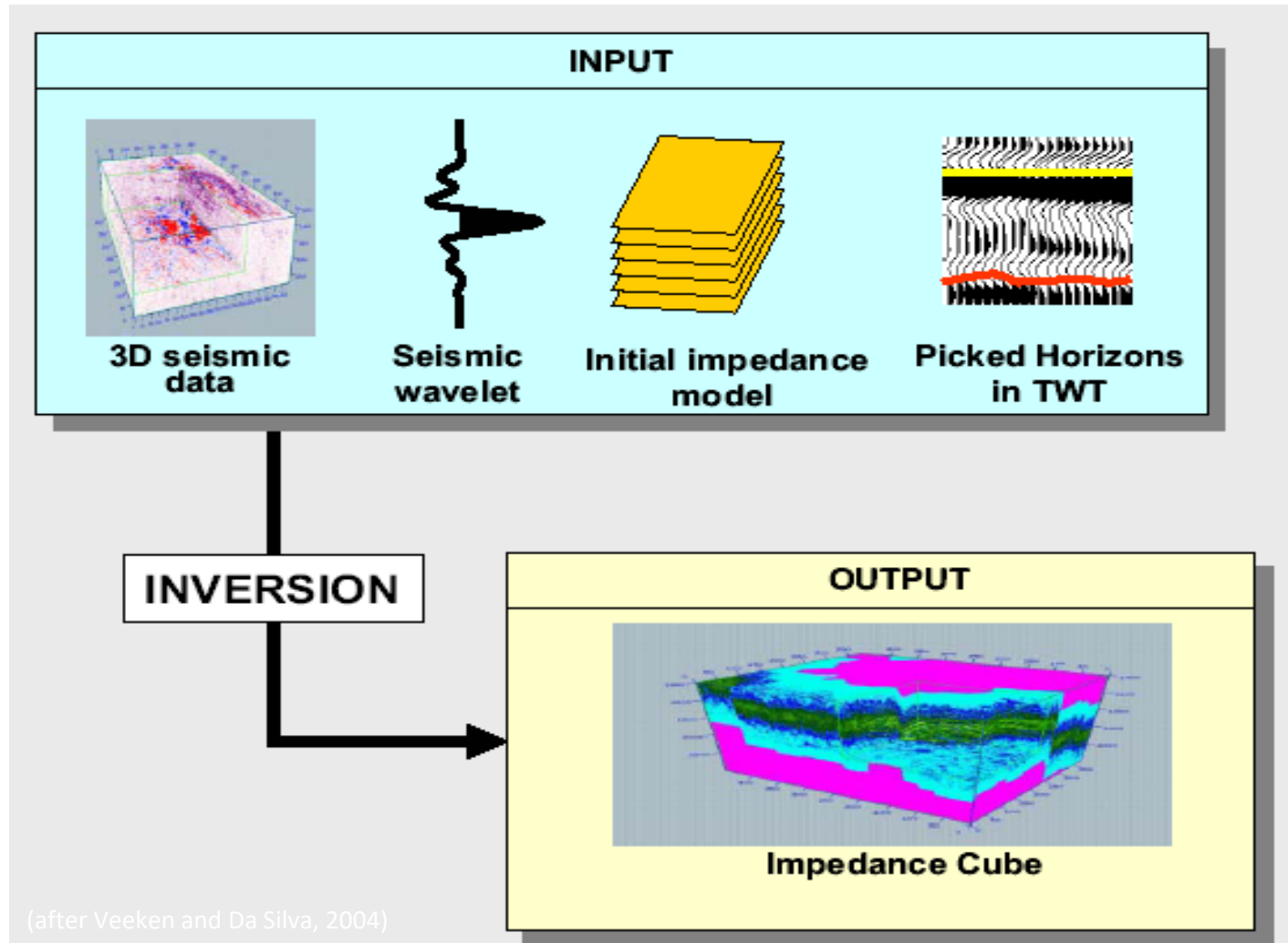
# Comparison Sparse-spike inversion - Colored inversion



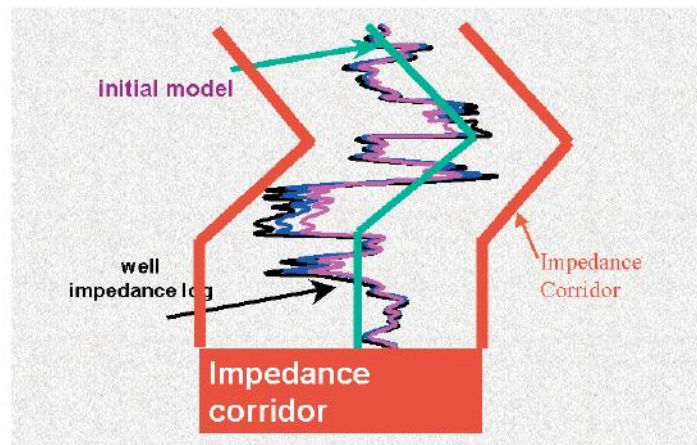
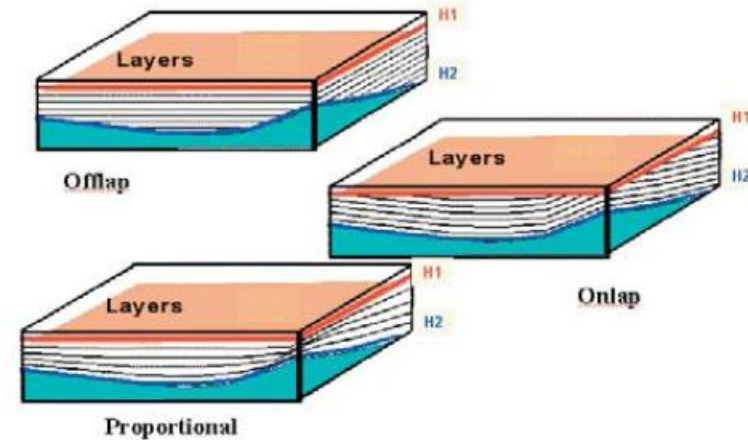
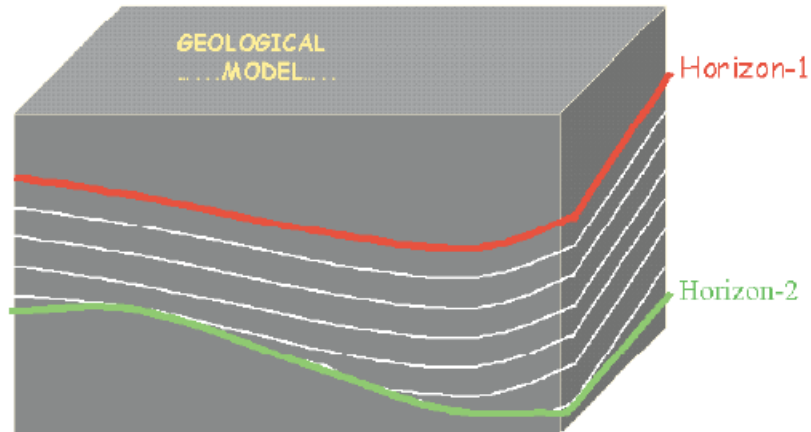
Results are very similar (in this case).

Advantage of colored inversion: results achieved within hours. Sparse spike inversion may take much longer.

# Model-Based Inversion

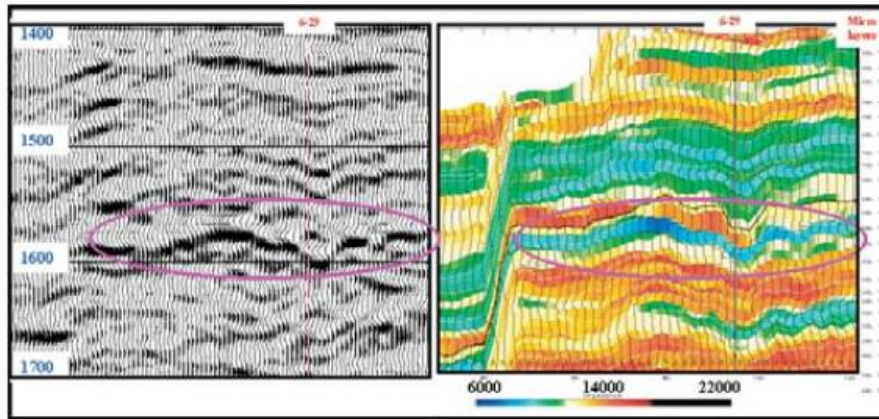


# How to build the impedance models (Walia 2001)

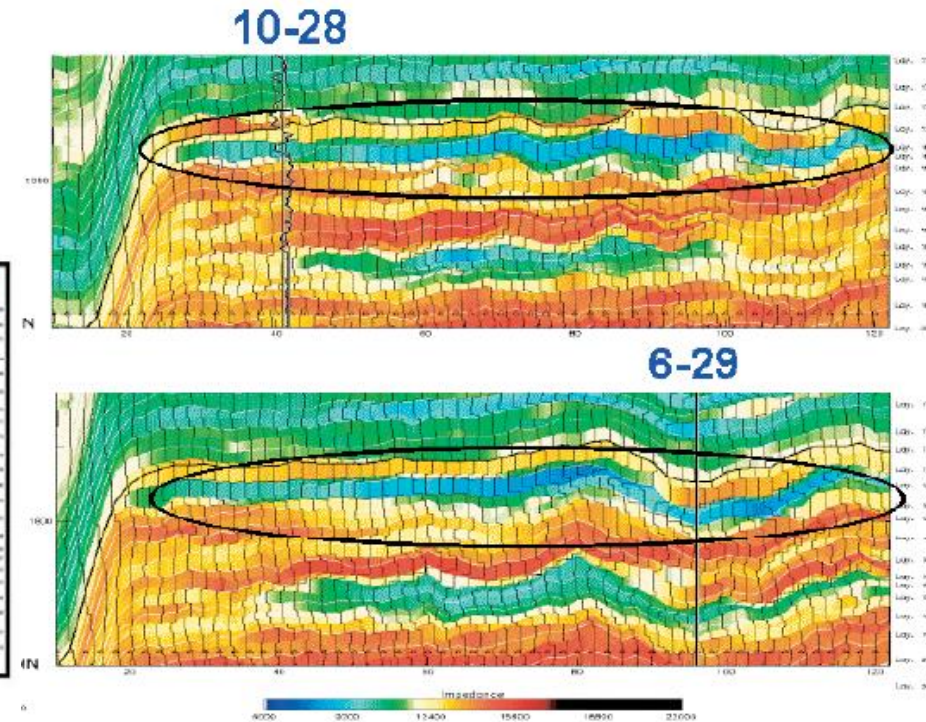


- Setup initial model with impedance layers limited by seismic horizons.
- Stochastic thin layer creation within each seismic layer
- Impedance range defined by well

# Results from Walia (2001)



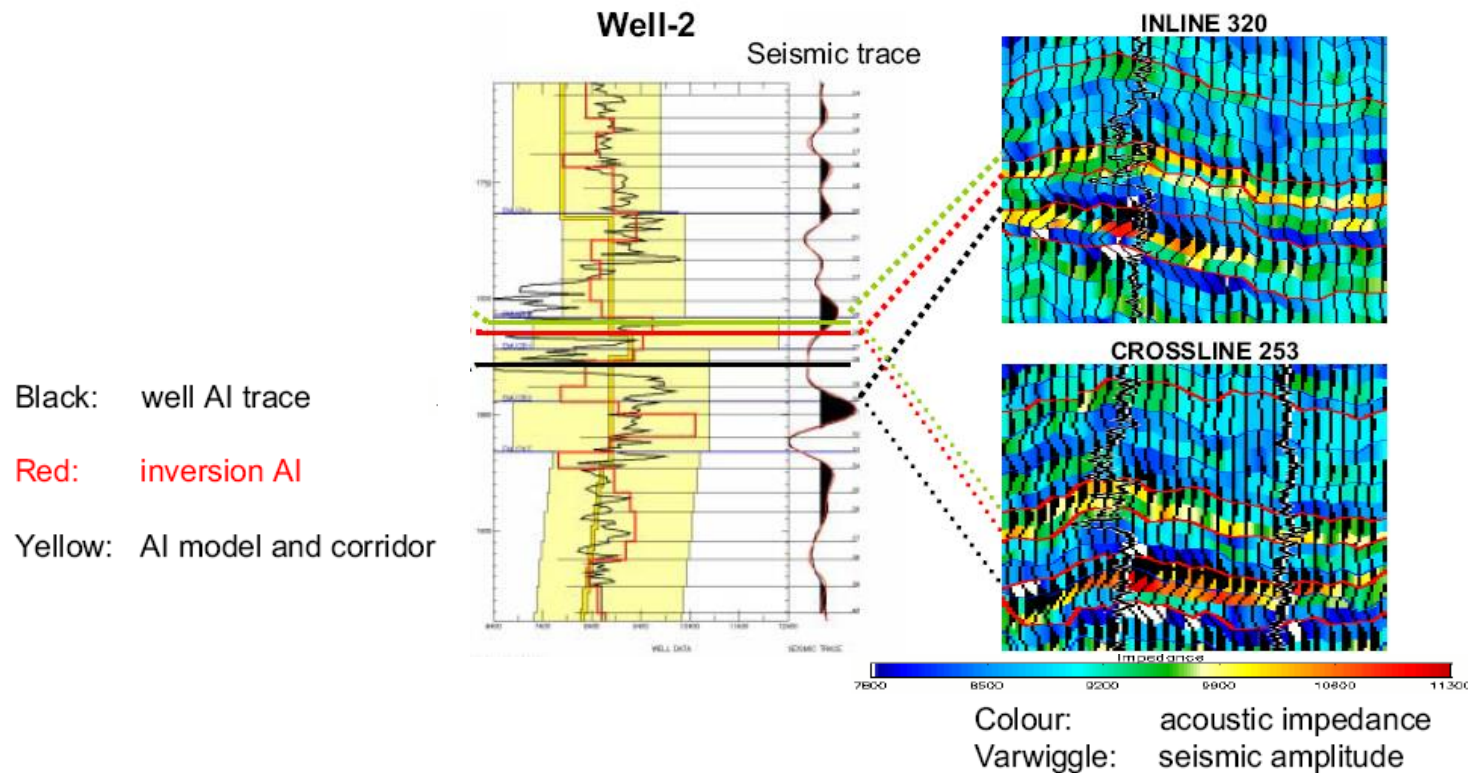
Seismic shows lower resolution compared to AI cube



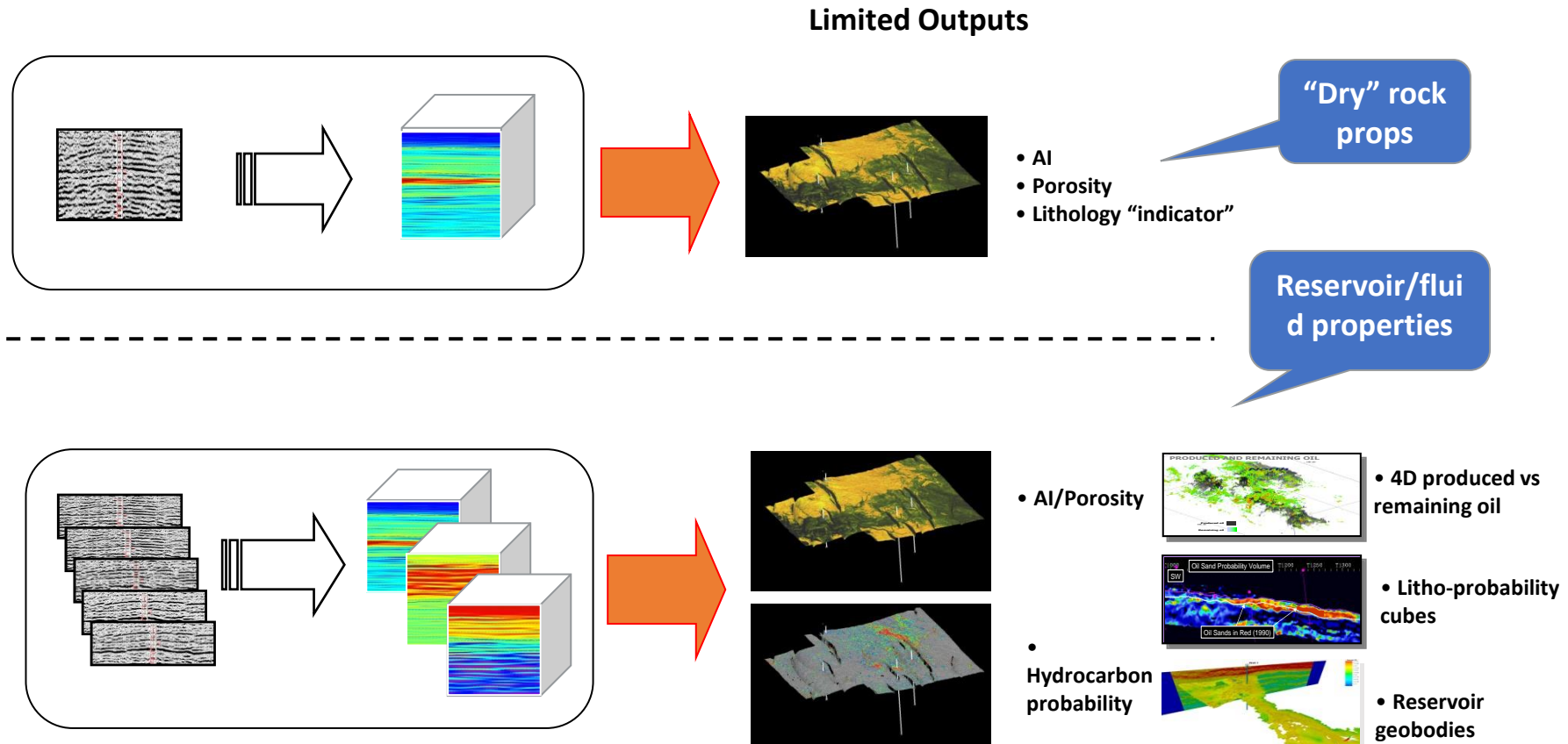
High acoustic impedance (green) at the well 10-28 of top sand confirmed by low gas production of well.

# Advantages of model driven AI

- Modeling guided by stratigraphic (seismic) horizons (reduces the number of possible models)
- Tuning effects resulting from thin layers have no significant effect on the acoustic impedance result
- **Higher resolution compared to seismic**
- Well logs not explicitly input to inversion process (Seismic does not need to match synthetics)
- BUT: result is non-unique



# Post-stack vs pre-stack inversion

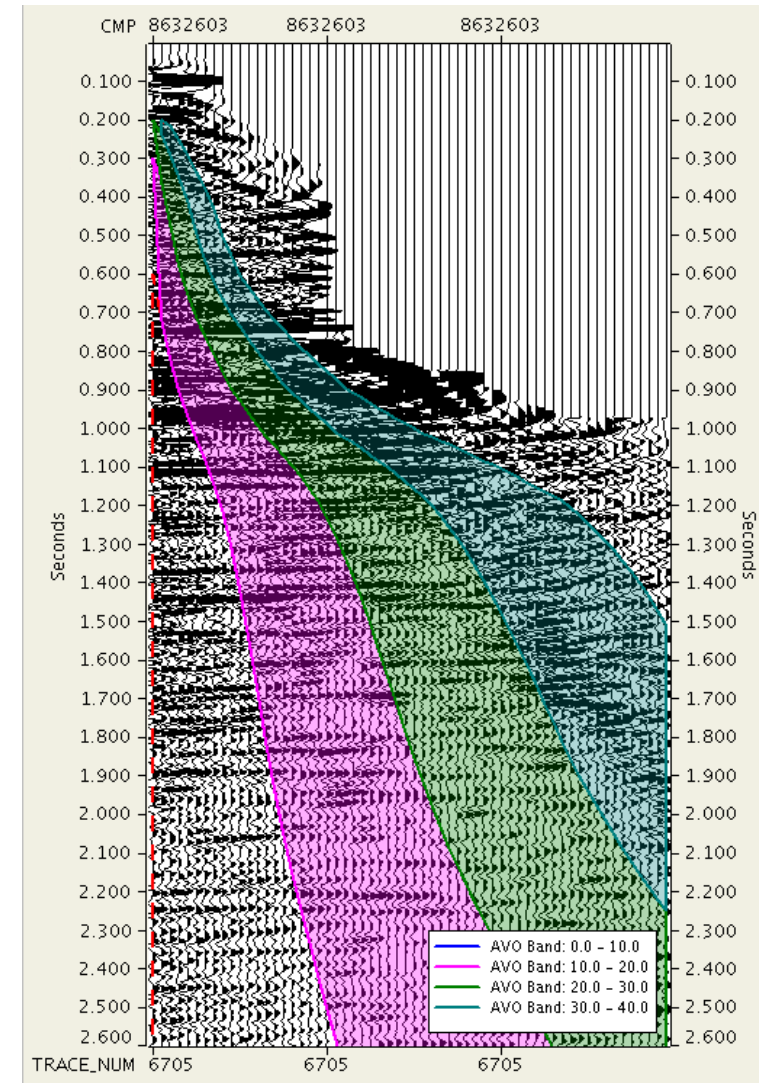
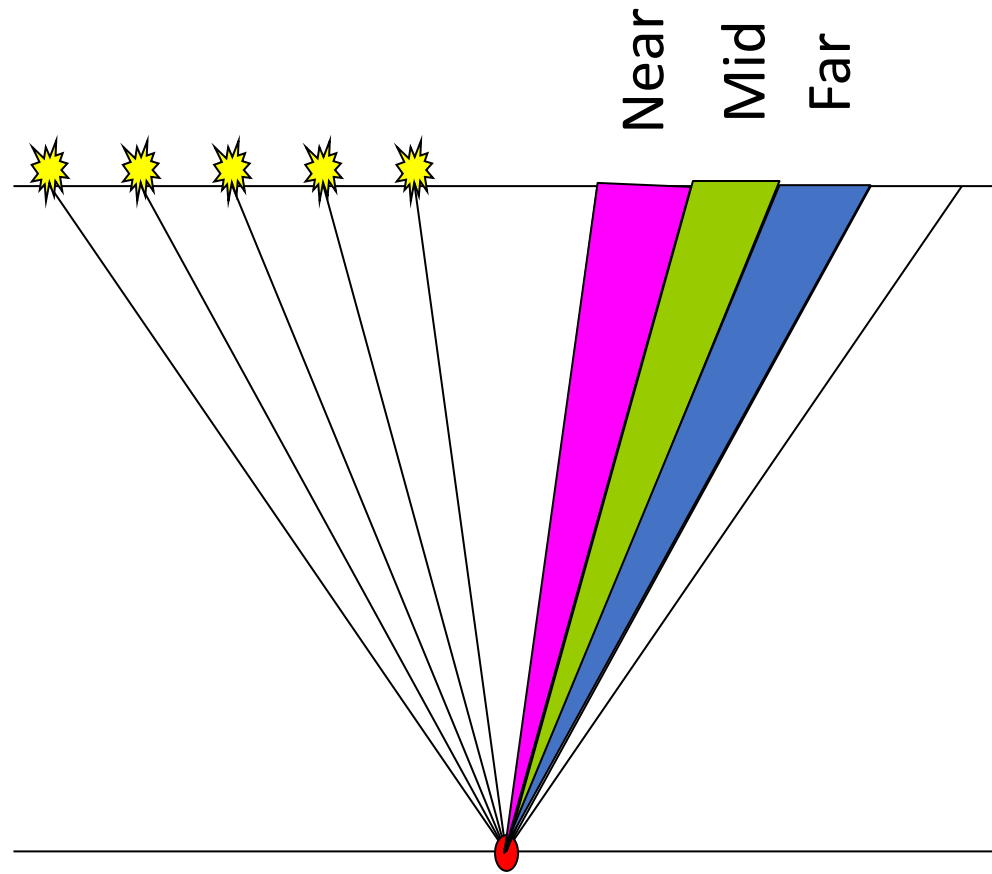


# AVO INVERSION

INPUT - Relative Elastic Impedances (NEAR - MID - FAR)

- Standard 2-term (Shuey) based on  $R = P + \sin^2\theta * G$ 
  - $RAI \sim P$
  - $RSI \sim P - G$
  - $Relative\ PRatio \sim P + G$
- 3-term inversion based on full Aki-Richards equation
  - $RAI$  (relative acoustic impedance)
  - $RSI$  (relative shear impedance)
  - $RRHO$  (relative density)

# Input to pre-stack seismic inversion



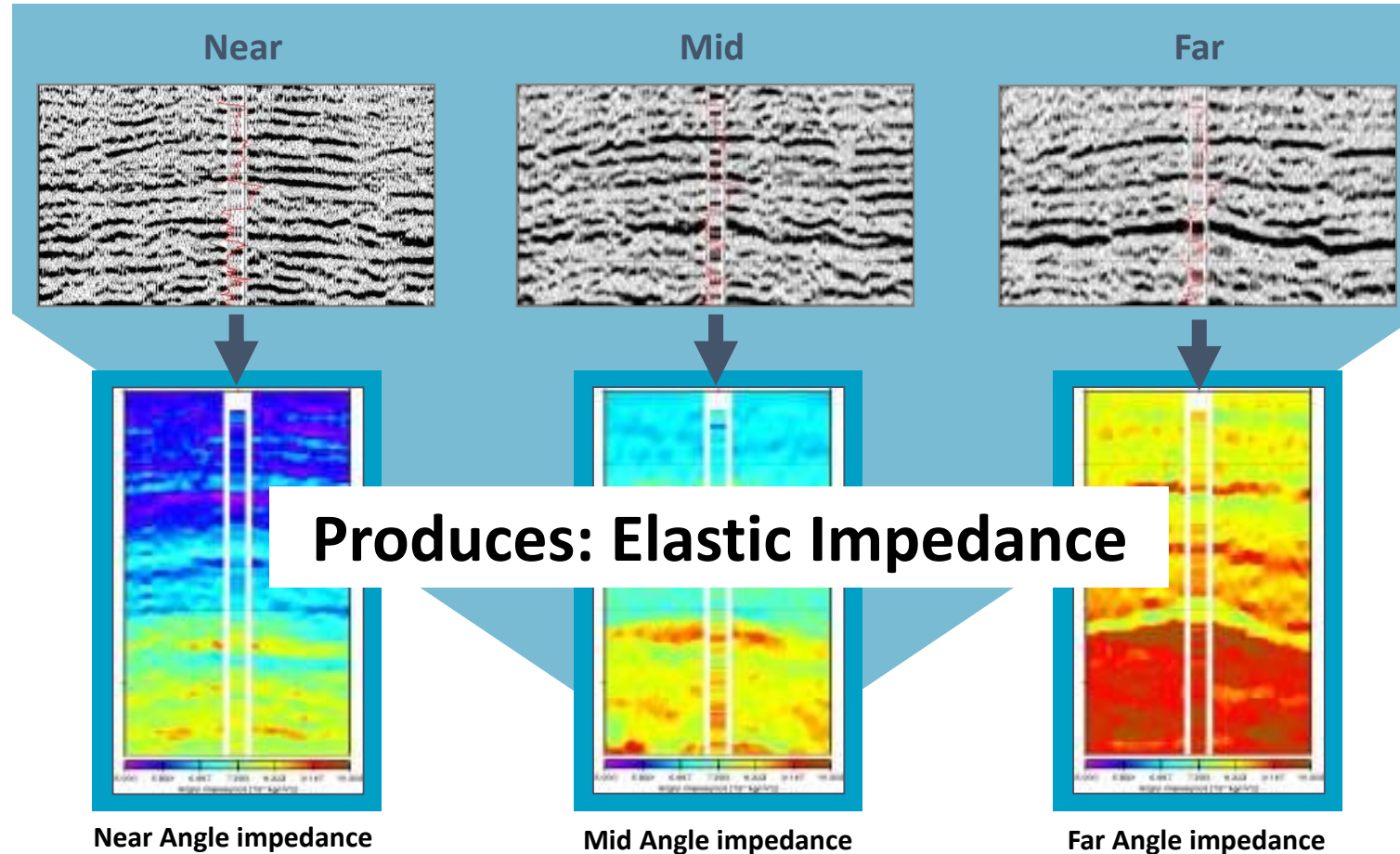
Angle stack bands

# Simultaneous Inversion vs Separate Inversion

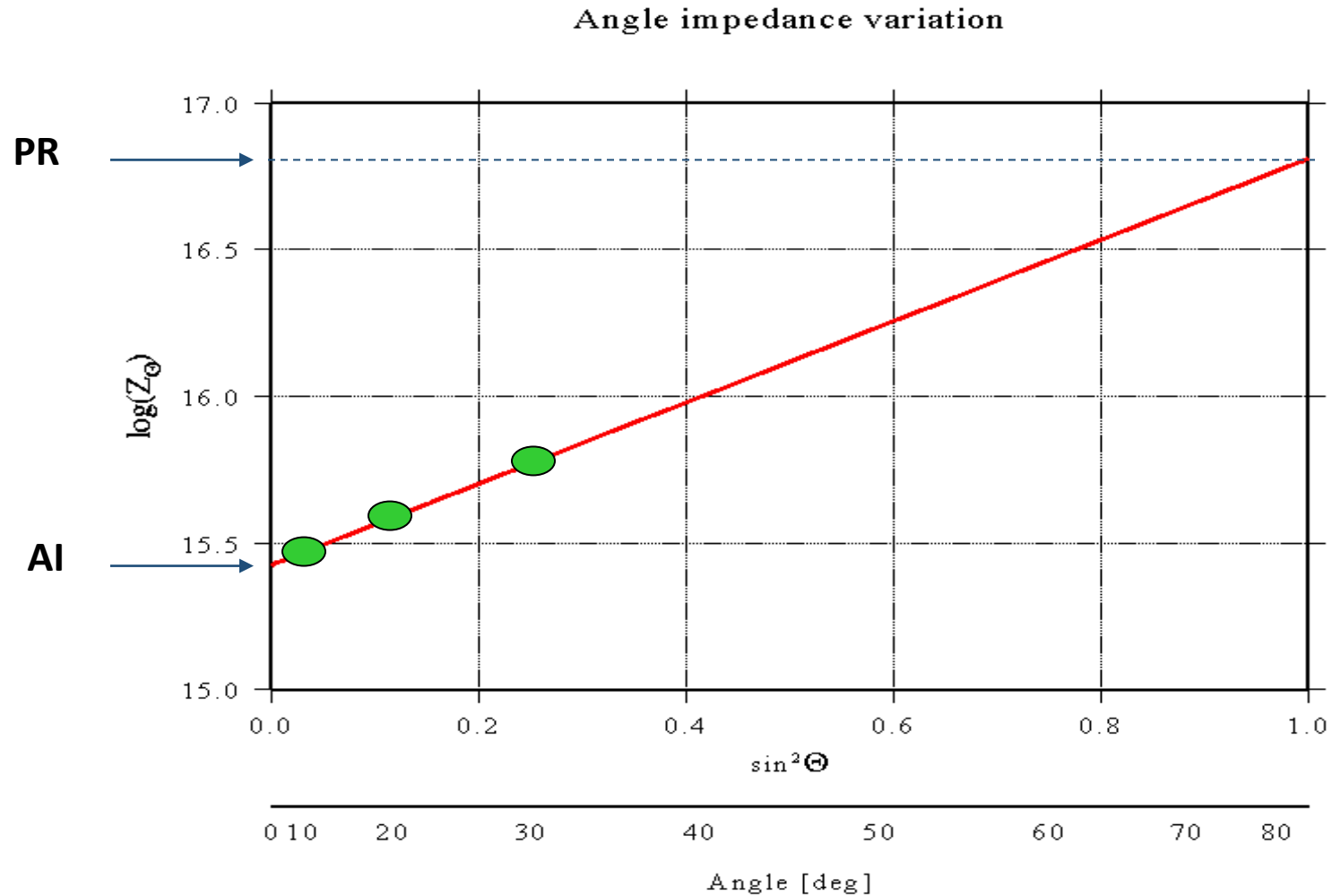
## Advantages of Simultaneous Inversion

- Noise cancellation
- Inversion directly for physical parameters
- Combined inversion run

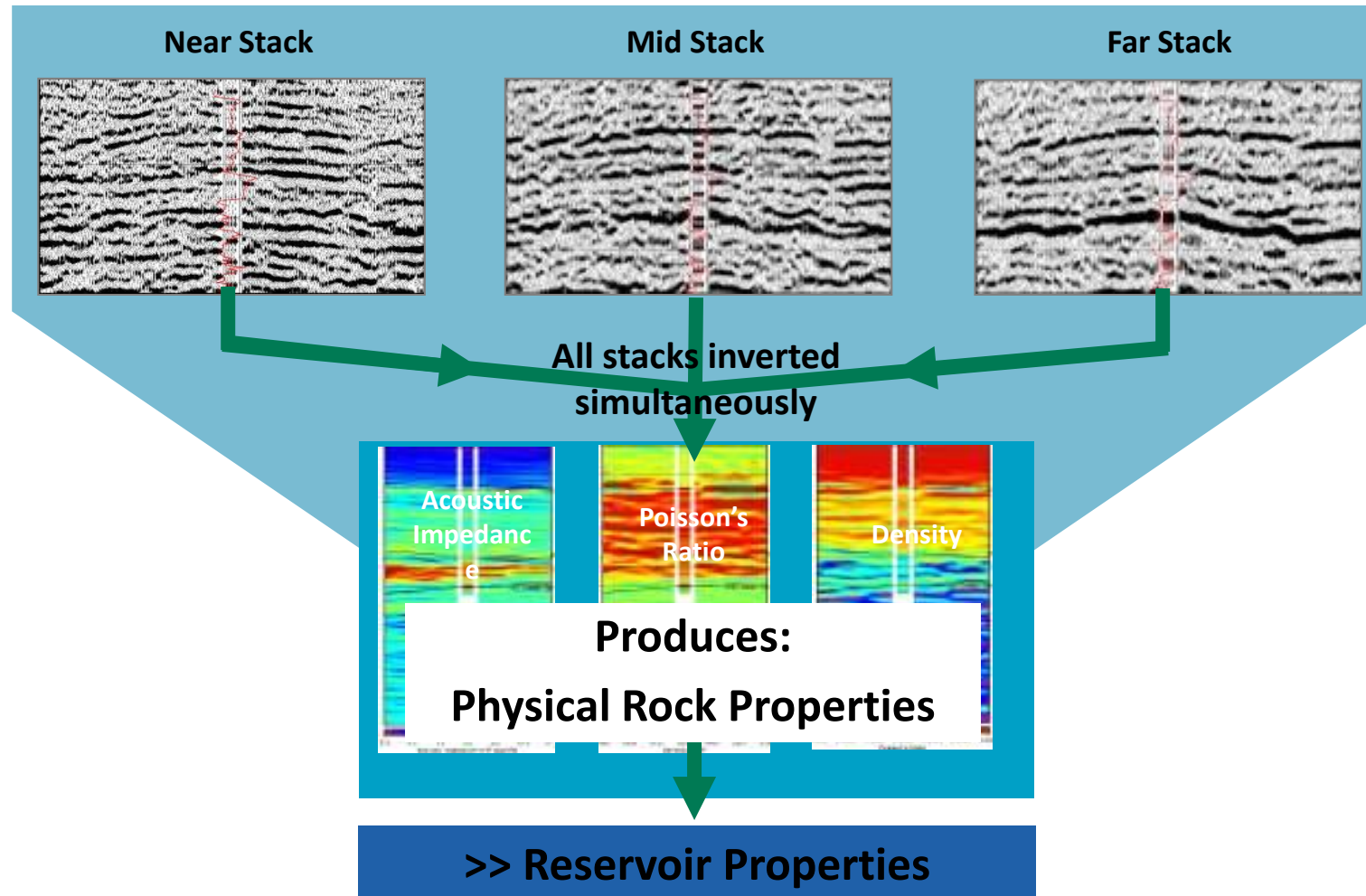
# SEPARATE AVO INVERSION ("ELASTIC INVERSION")



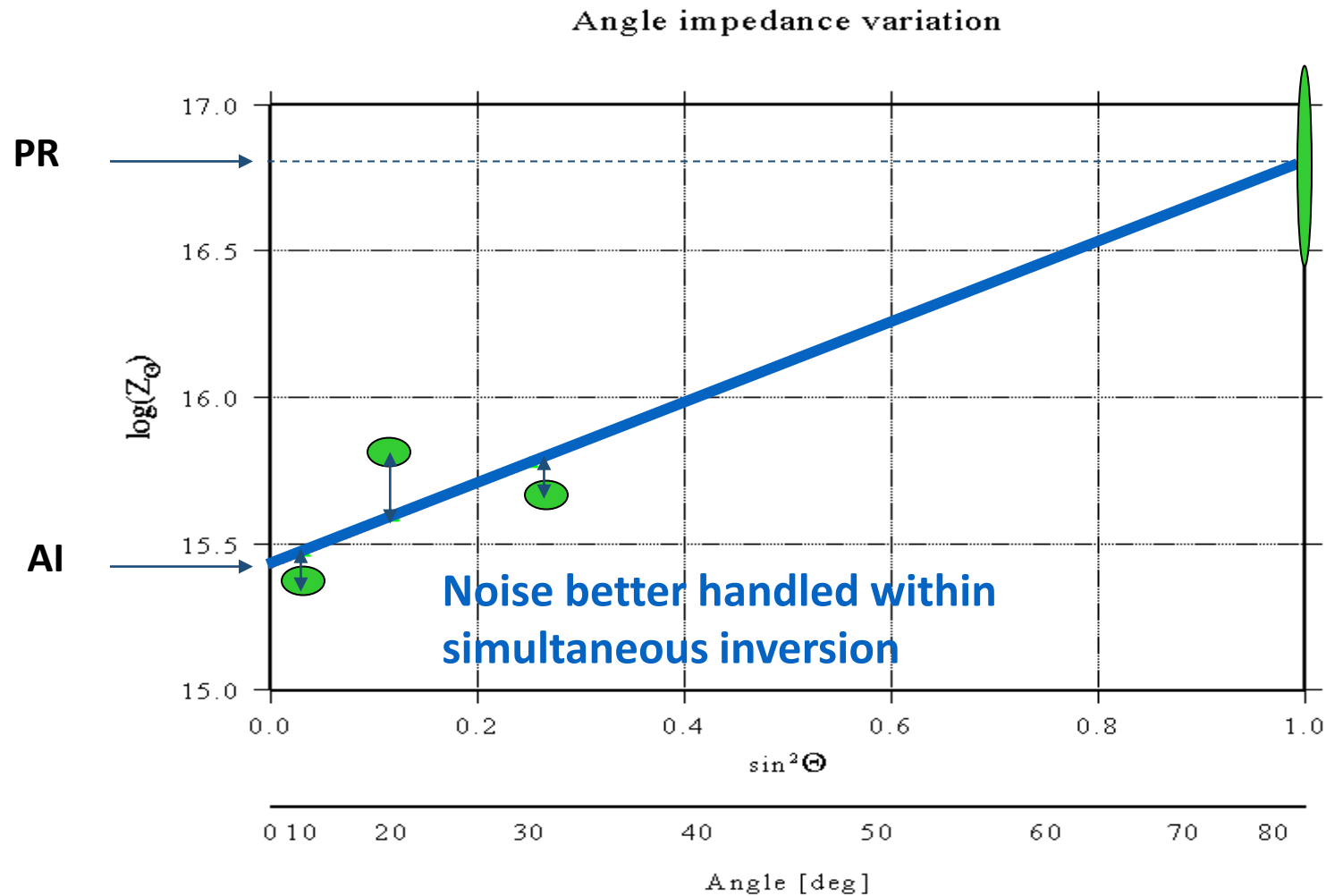
# Separate AVO inversion



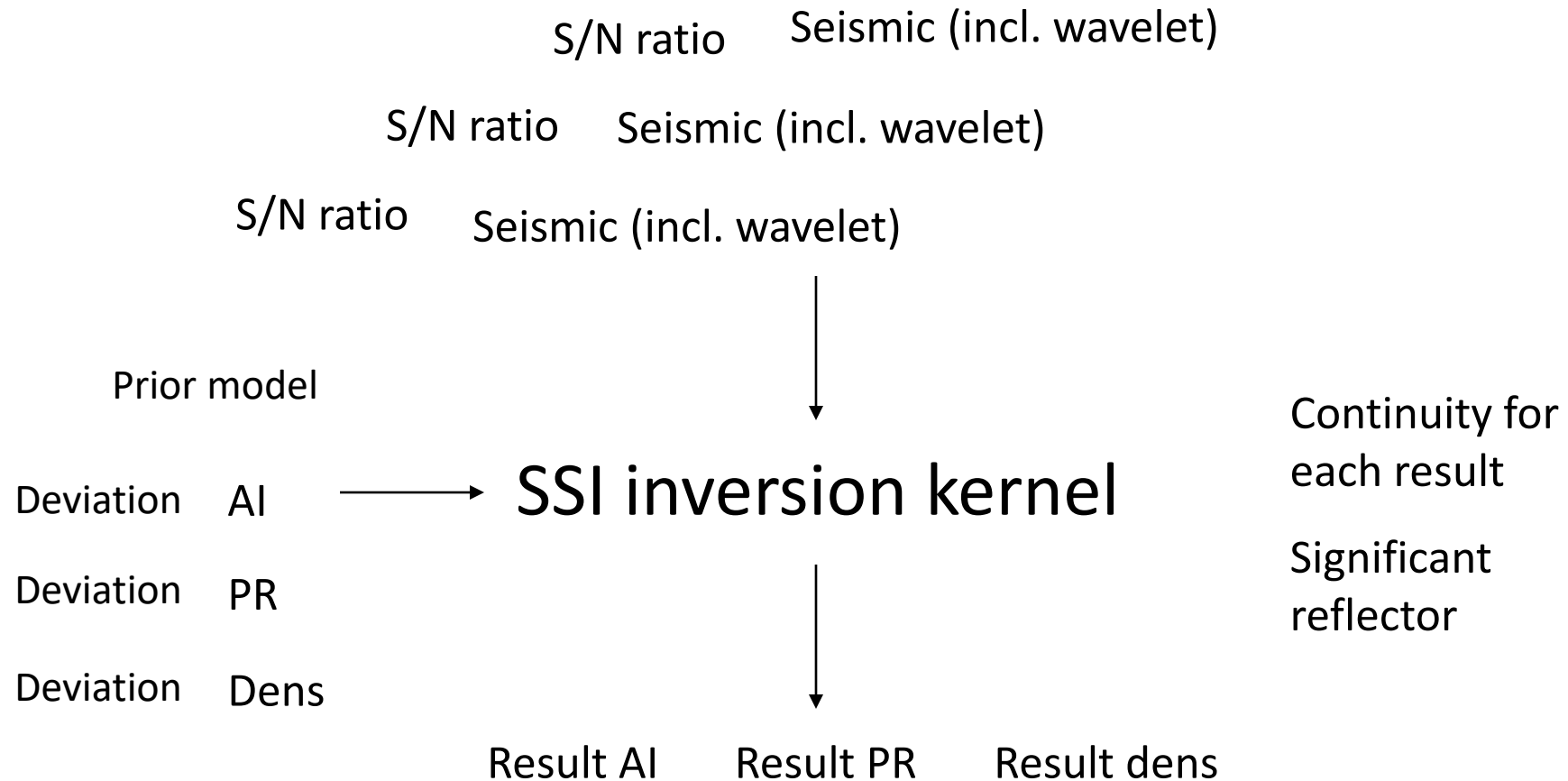
# GLOBAL SIMULTANEOUS INVERSION



# Simultaneous AVO inversion



# SSI Simultaneous AVO Inversion



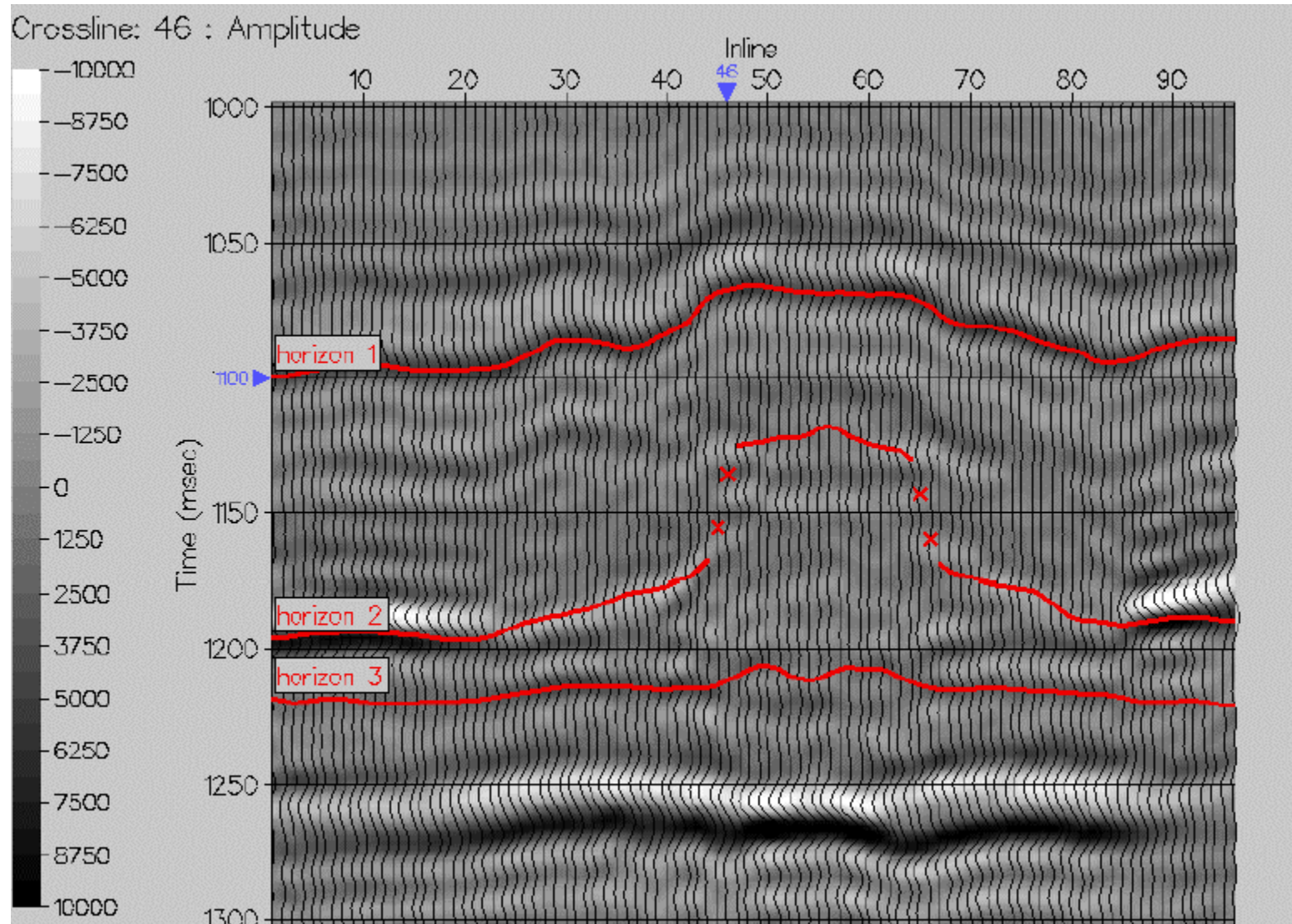
# Seismic inversion techniques

Inversion techniques can be divided into two main classes:

- Those employing global optimization, such as SSI Global Seismic Inversion.
- Those employing local optimization, such as sparse-spike based methods.

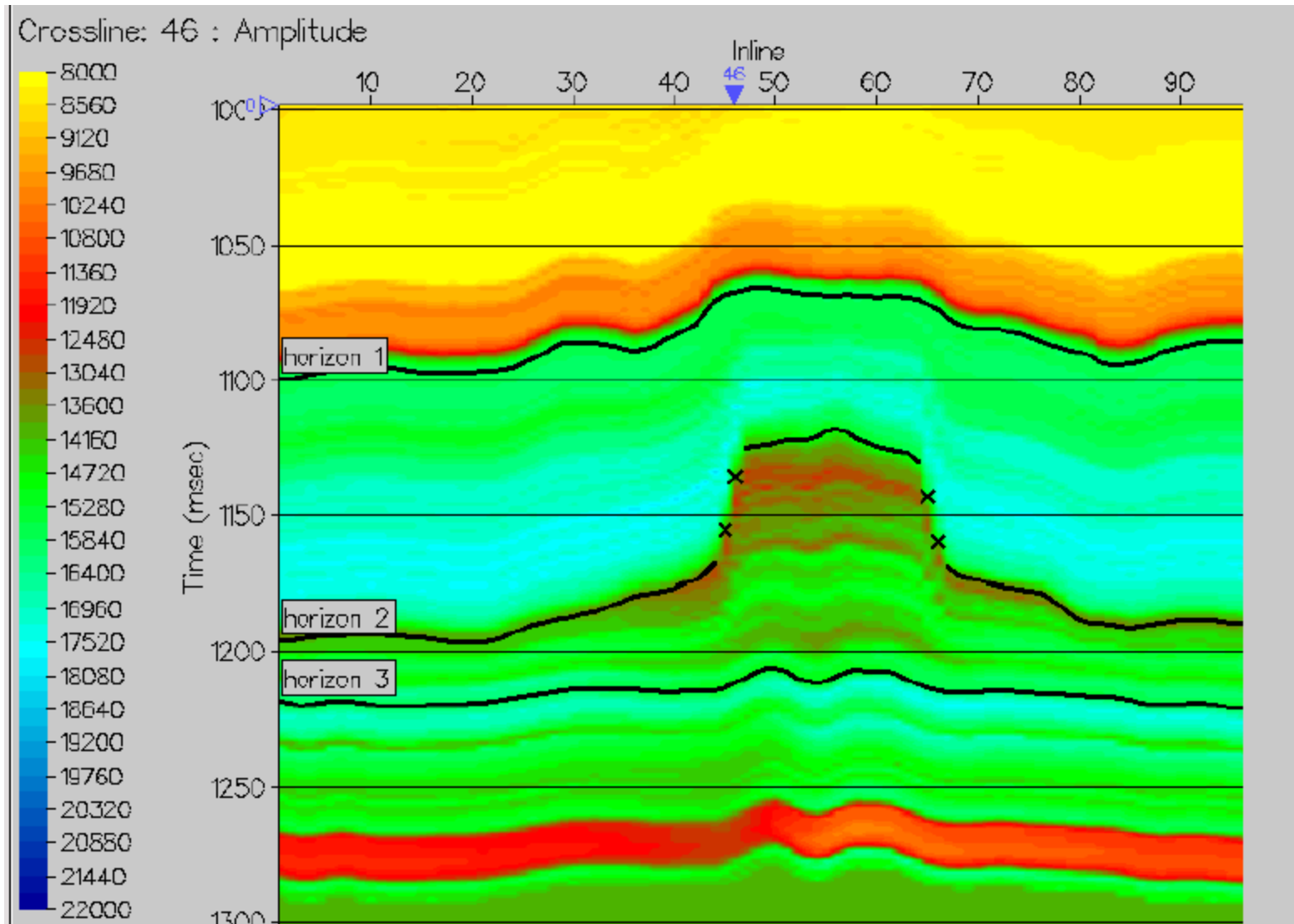
# Inversion Methods

## Seismic Input Data



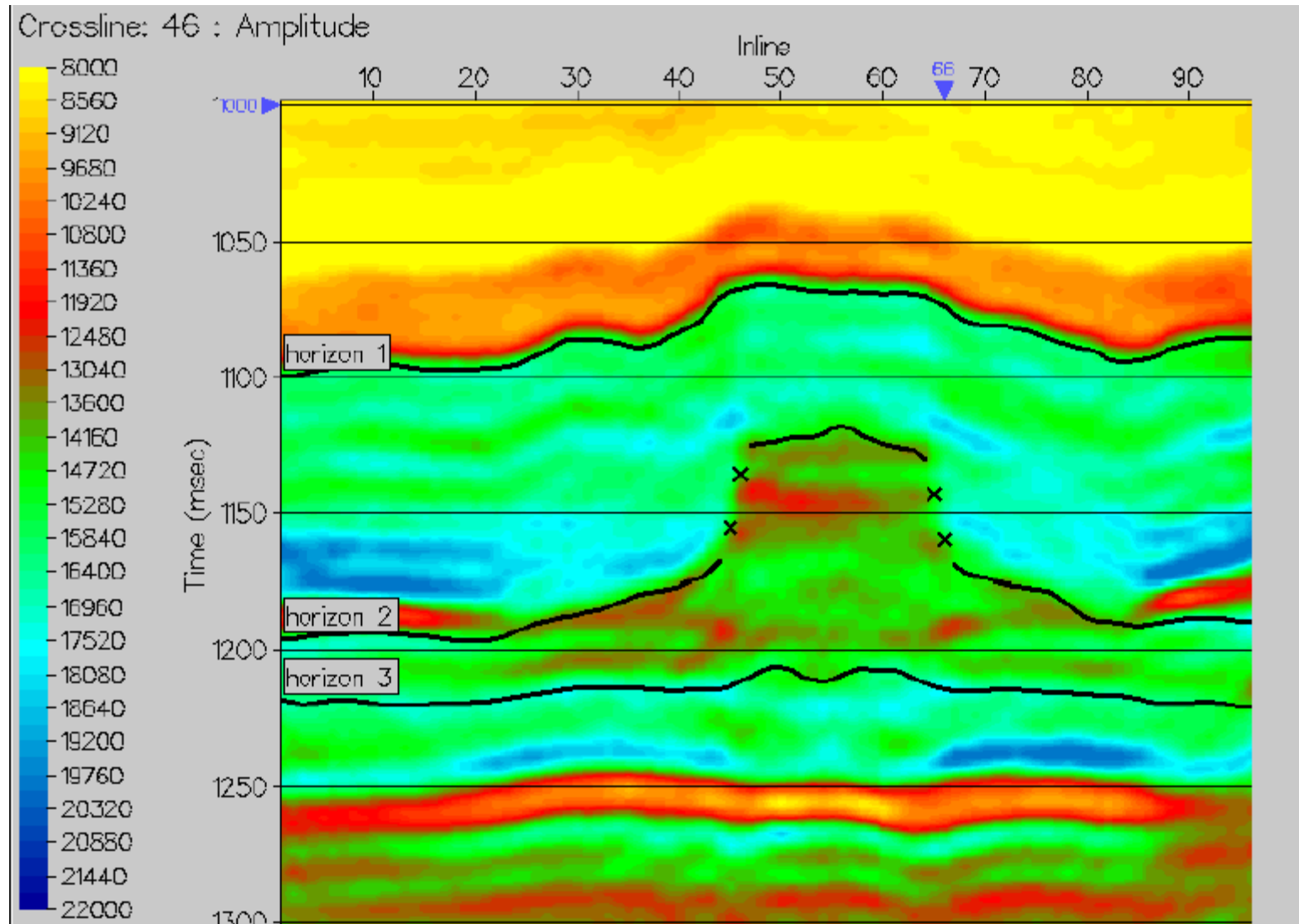
# Inversion Methods

## Relative Acoustic Impedance by Colored Inversion



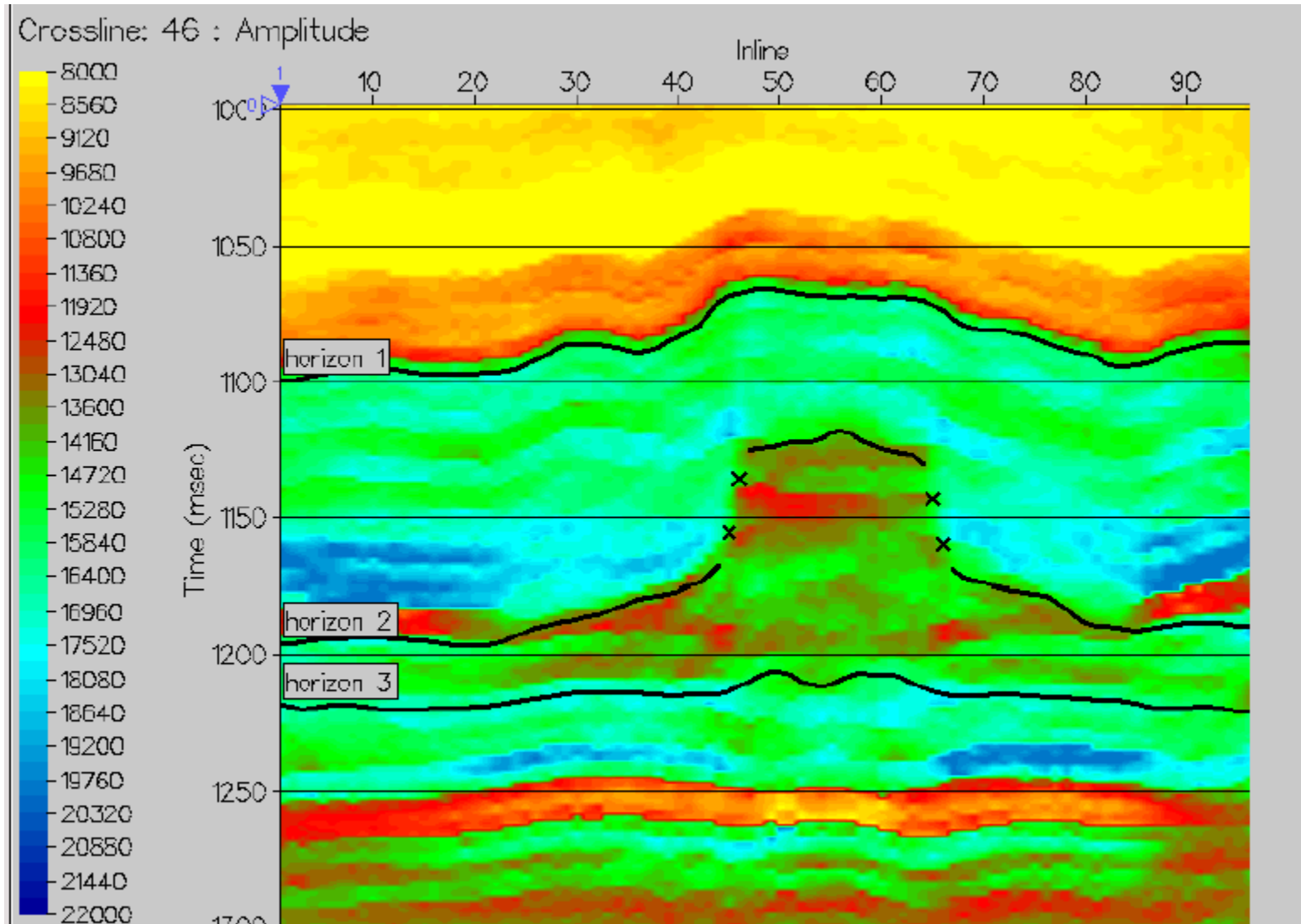
# Inversion Methods

## Model-Based Acoustic Impedance



# Inversion Methods

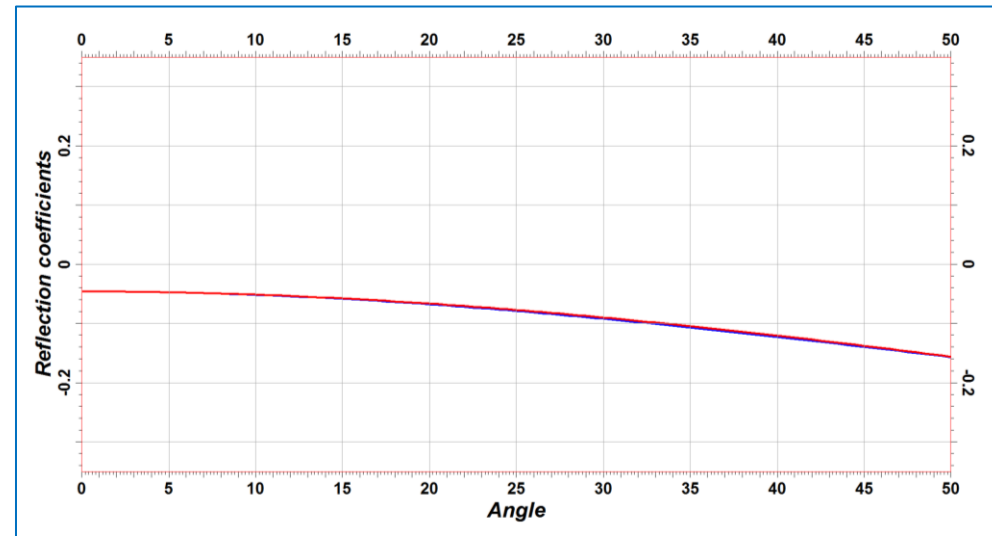
## Discrete Spike Impedance



# Why Non-Linear, Anisotropic AVO Inversion?

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**

	Vp	Vs	den	$\epsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	2600	1800	2	0	0	0



- Linear
- Non-Linear

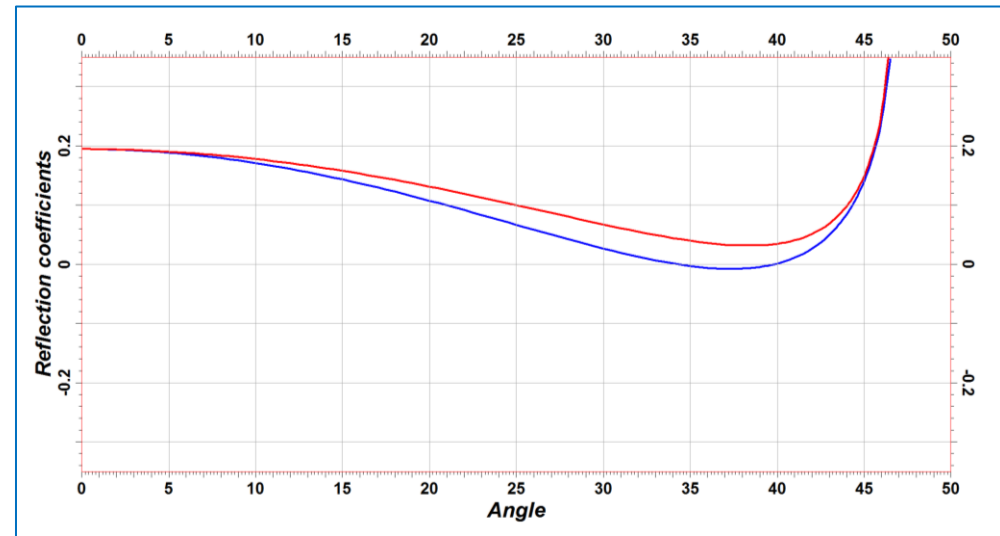
## Non-linear orthorhombic AVAZ inversion workflow

E.Gofer, R.Bachrach, R.Fletcher, M.Vie - 86th SEG International Annual Meeting, 2016

# Why Non-Linear, Anisotropic AVO Inversion?

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	Vp	Vs	den	$\epsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	3600	2400	2.35	0	0	0



- Linear
- Non-Linear

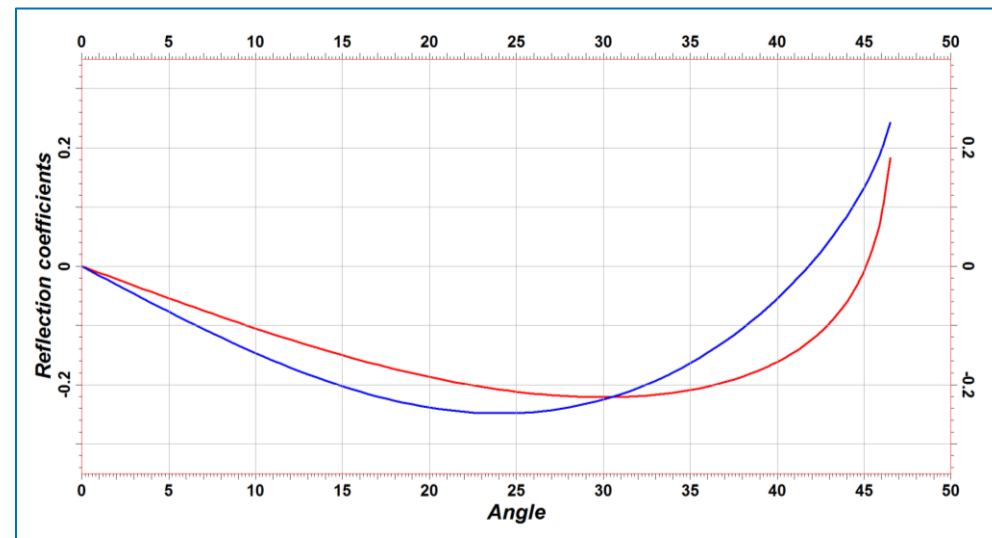
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# Why Non-Linear, Anisotropic AVO Inversion?

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  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**
- This is even more important for **PS data**

	Vp	Vs	den	$\epsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	3600	2400	2.35	0	0	0

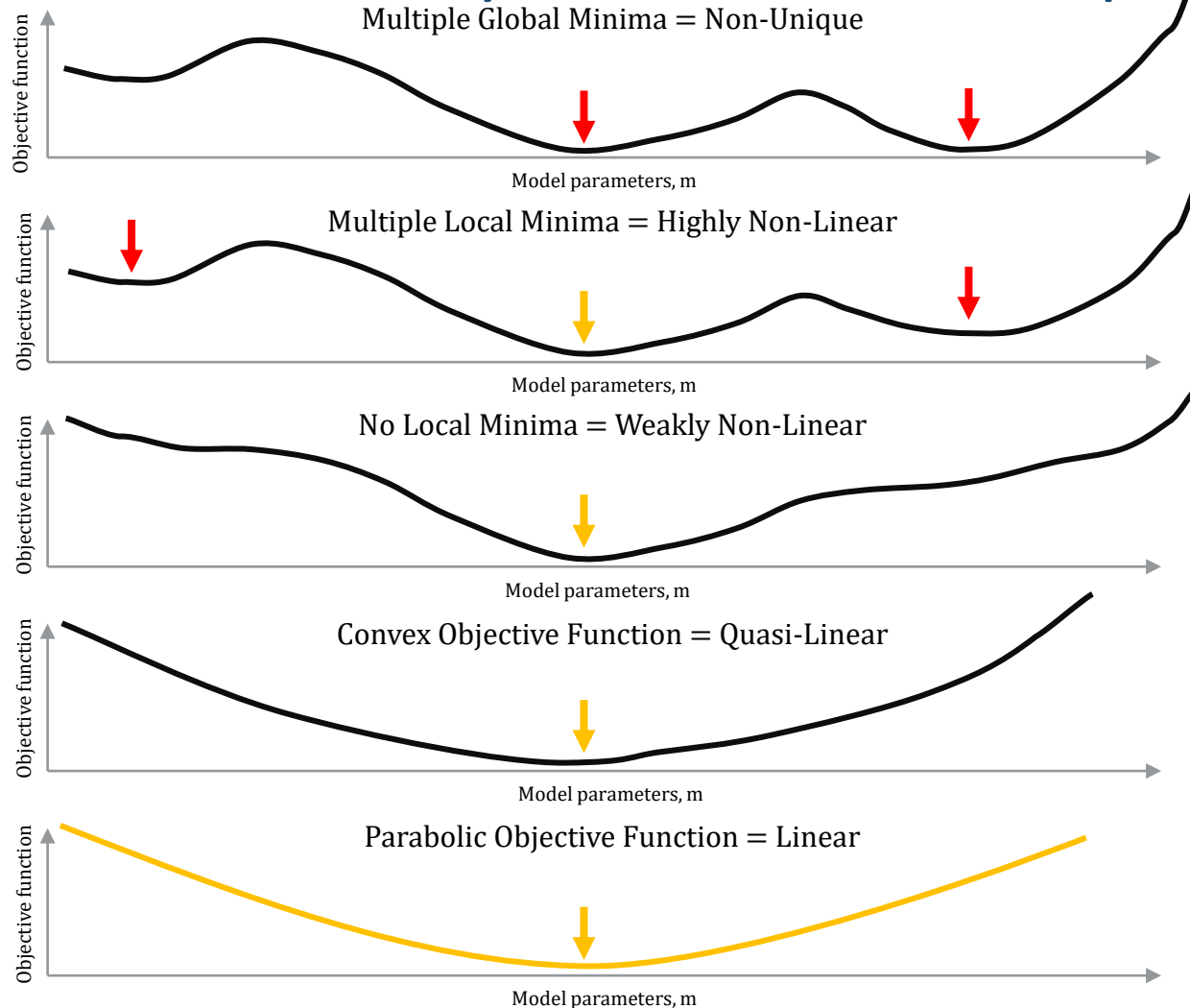


- Linear
- Non-Linear

## Non-linear orthorhombic AVAZ inversion workflow

E.Gofer, R.Bachrach, R.Fletcher, M.Vie - 86th SEG International Annual Meeting, 2016

# Hierarchy of inversion problems



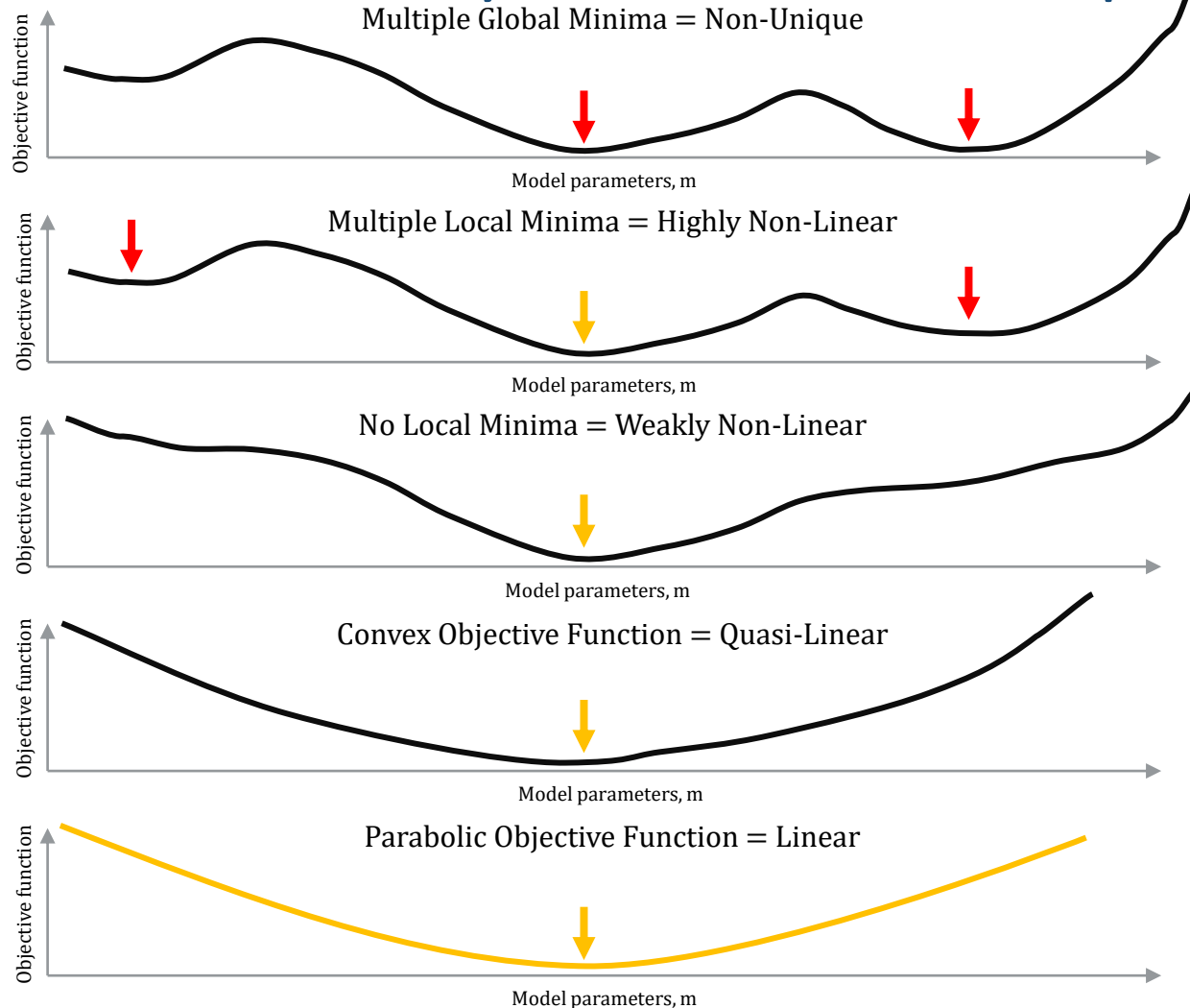
Seismic inversion is **non-unique** because of **limited bandwidth of seismic signal**, amplitude errors and noise

**'a priori' constraints** to reduce the non-uniqueness

Types of inversion methods:

- global inversion (GA, simulated annealing, ...)
- local search (Simplex, Taboo, ...)
- descent type or linearized inversion (Newton, Gradient based)

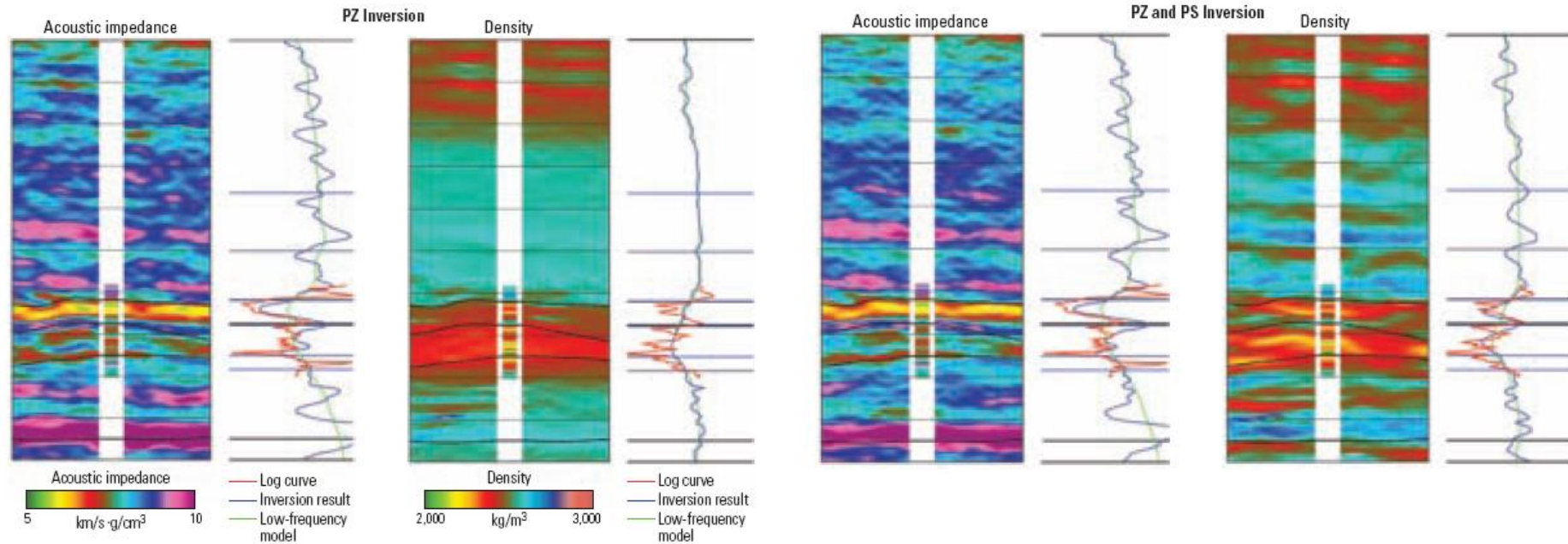
# Hierarchy of inversion problems



## Waveform Inversion of

- pre-stack seismic data using Finite Difference Modelling
- pre-stack seismic data using Dynamic Ray-tracing
- pre-stack seismic data using 1D Reflectivity Modelling
- **multiple angle stacks using (Linearized) Zoeppritz equation and convolution**
- Single stack using convolution

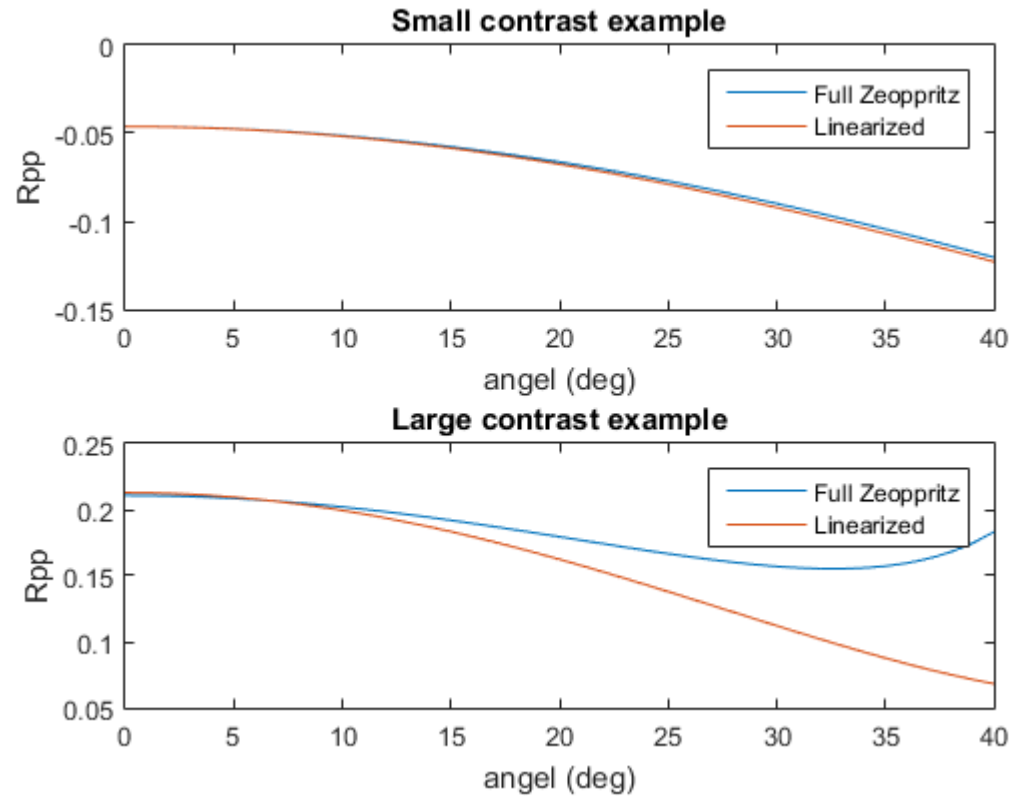
# Comparison post-stack - pre-stack inversion



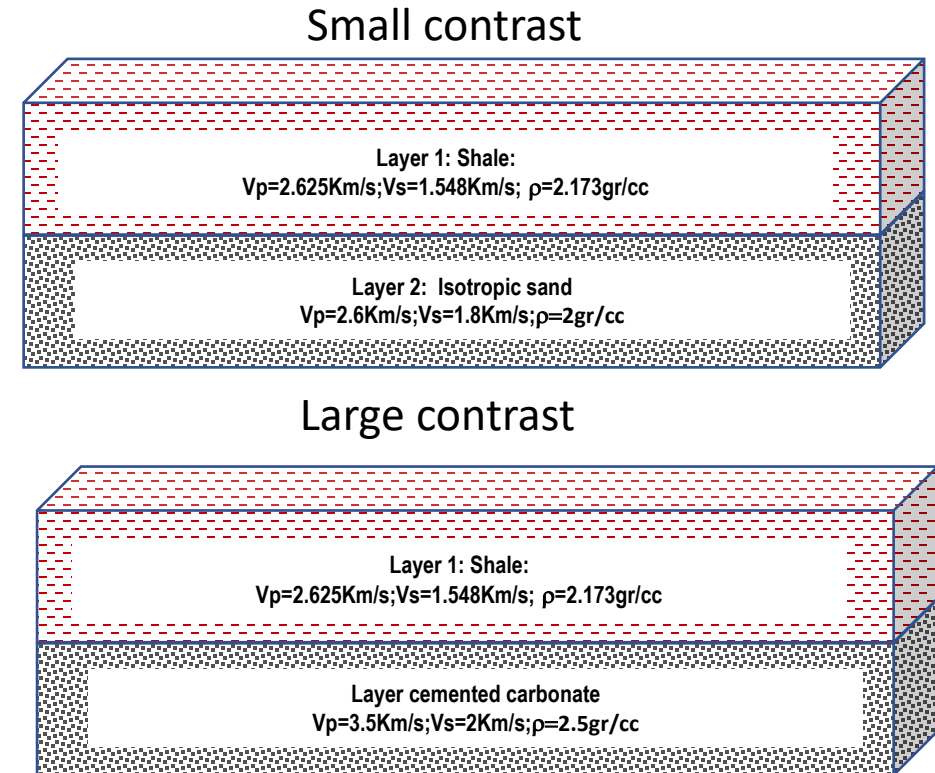
Left: Acoustic impedance cube and density cube based on P-seismic only.

Right: Inversion based on P- and S-seismic. Note the higher resolution of the density section.

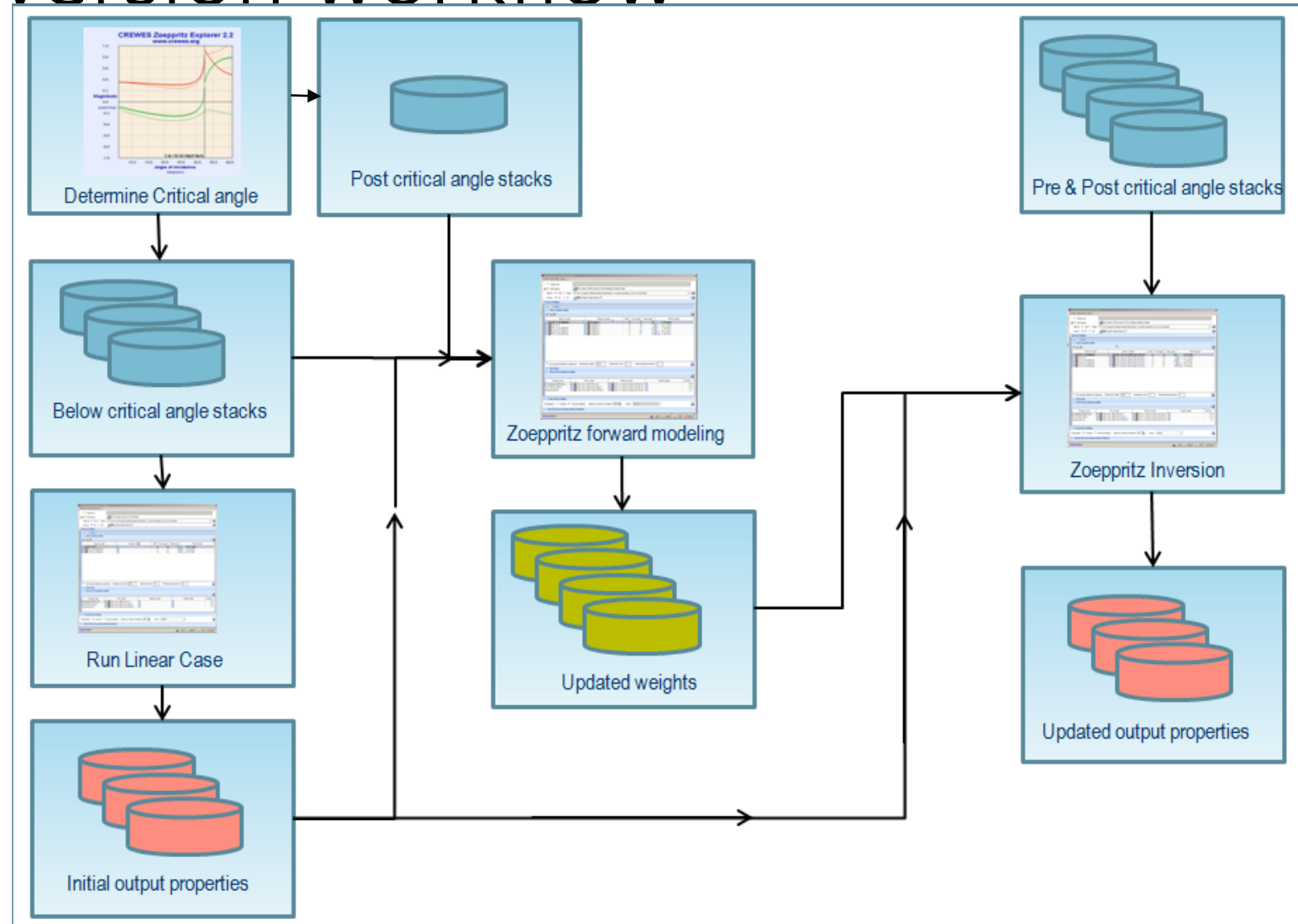
# Linearized vs non linear PP example



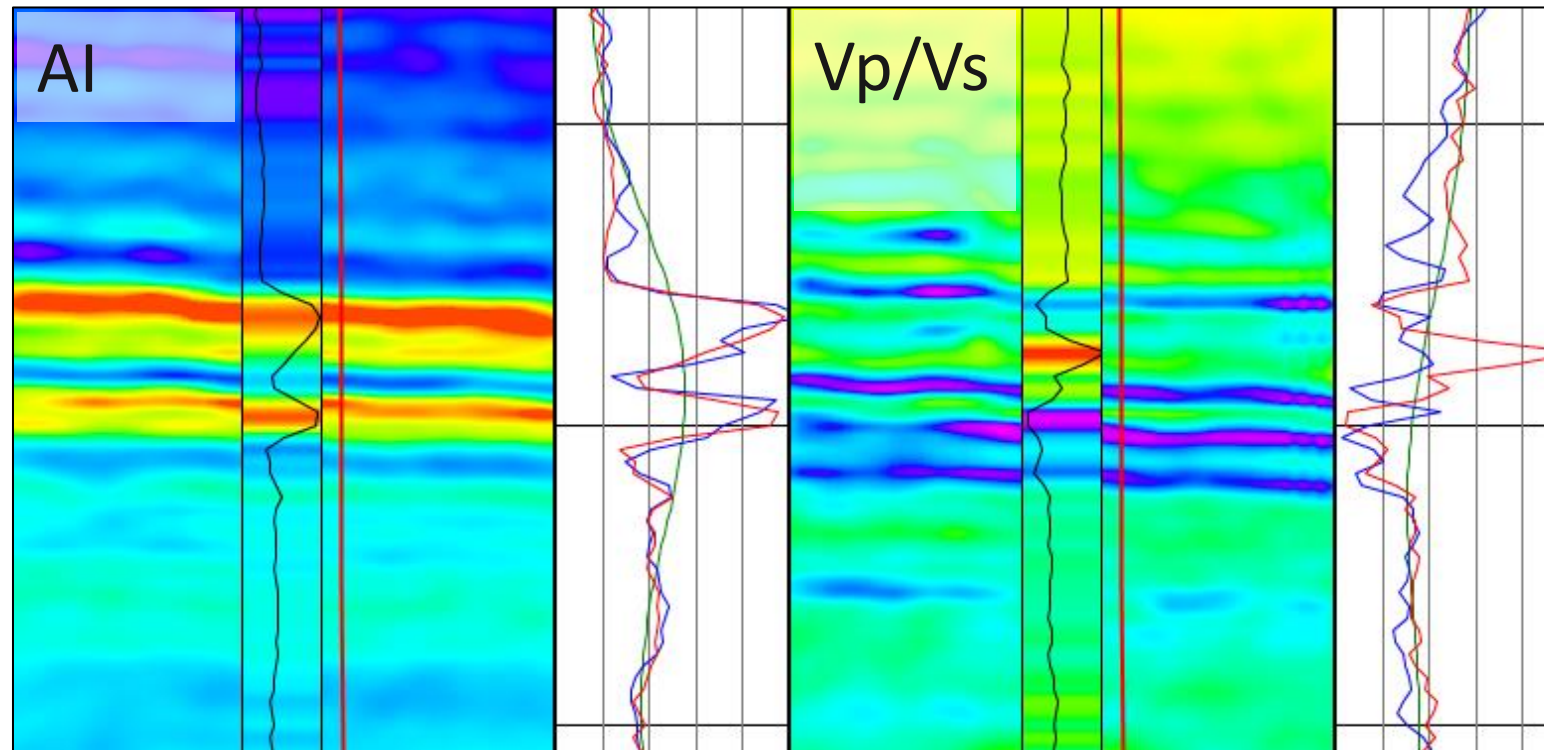
Large contrast and high angles...



# GBO inversion workflow



# Conventional Aki&Richards Linear Inversion

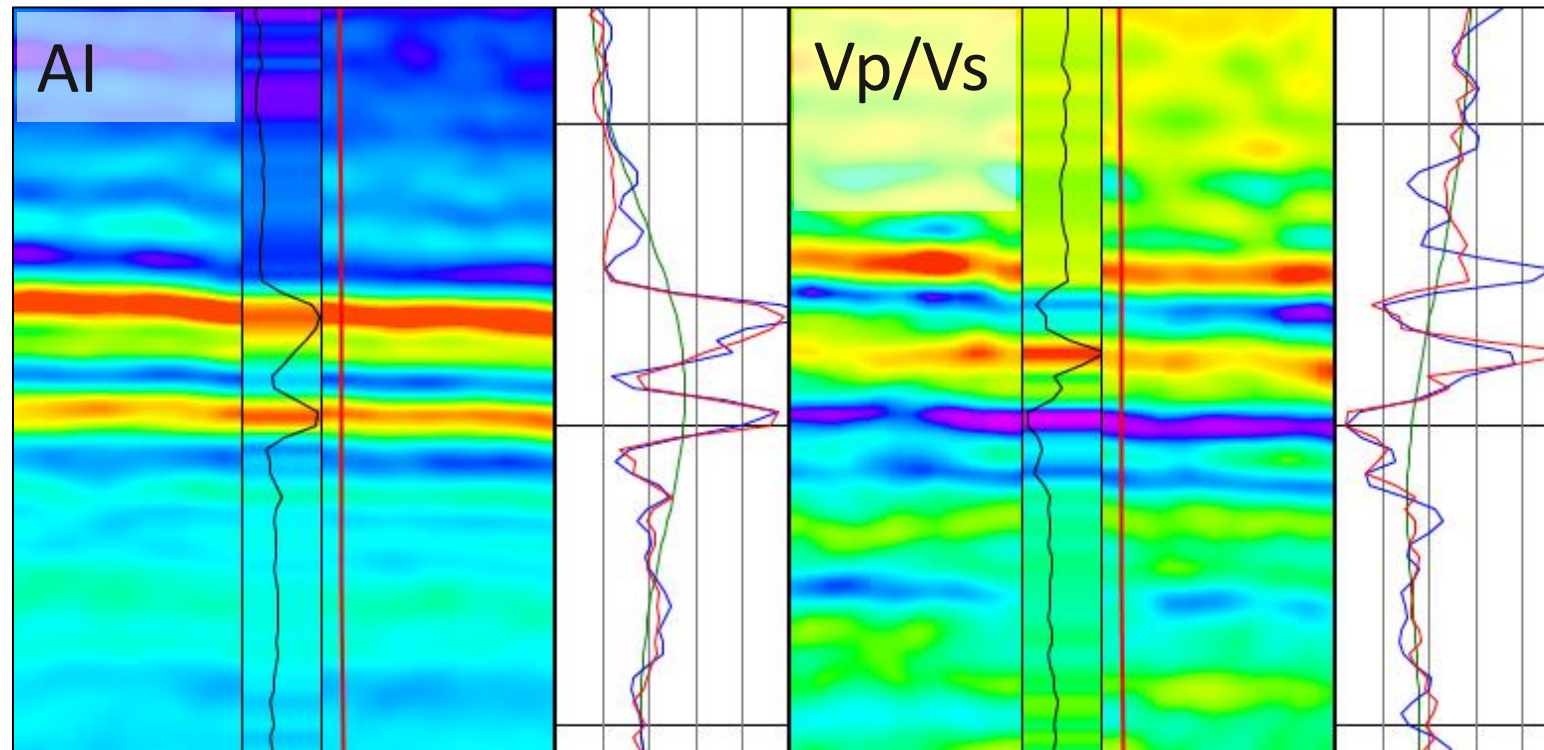


Inversion result

Well log

LFM

# Zoeppritz Non-Linear Inversion



# Summary:

## Why seismic inversion

- ***Direct link to reservoir parameters***
  - Option to invert seismic cube directly to reservoir parameters who have a strong influence on the acoustic impedance (porosity, shaliness, density etc)
- ***AVO inversion: direct link to rock properties***
- Output of geological layers rather than reflection edges
- Better image of the stratigraphy
- Higher resolution compared to seismic
- Reduction of wavelet tuning effect

# Summary on Seismic Inversion

- Impedance inversion allows fluid determination in the reservoir rocks: Gas or water (oil with gas in solution)
- Well log conditioning is the key for constraining inversion
- Seismic inversion is not a unique process. Several AI models can generate similar synthetic traces when convolved with the wavelet. The number of possible solutions is significantly reduced by putting constraints on the modeling.
- Stratigraphic interpretation is improved

# Summary on Seismic Inversion

- Seismic impedance volume allows the integration of seismic amplitudes for reservoir characterization.
- The analysis of 3D seismic data in terms of acoustic impedance provides rock parameter estimation: porosity, permeability, shale volume, net sand, etc.
- 3D acoustic impedance “soft data” for geostatistical model of rock properties

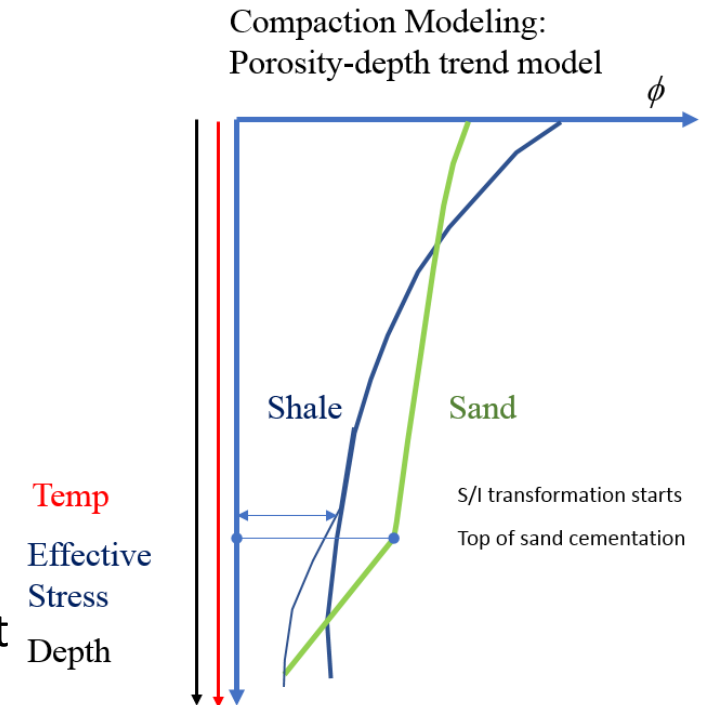
# Seismic Inversion

## A Word of Caution

- Other techniques, such as multi-component inversion, elastic inversion and AVO should be used to better discriminate fluid content and lithology.
- Seismic velocities are sensitive to the presence of gas in a rock sequence. A 5-10% gas saturation has already a tremendous impact on the seismic response. It will lead to AVO and AI anomalies, but these are non-commercial.

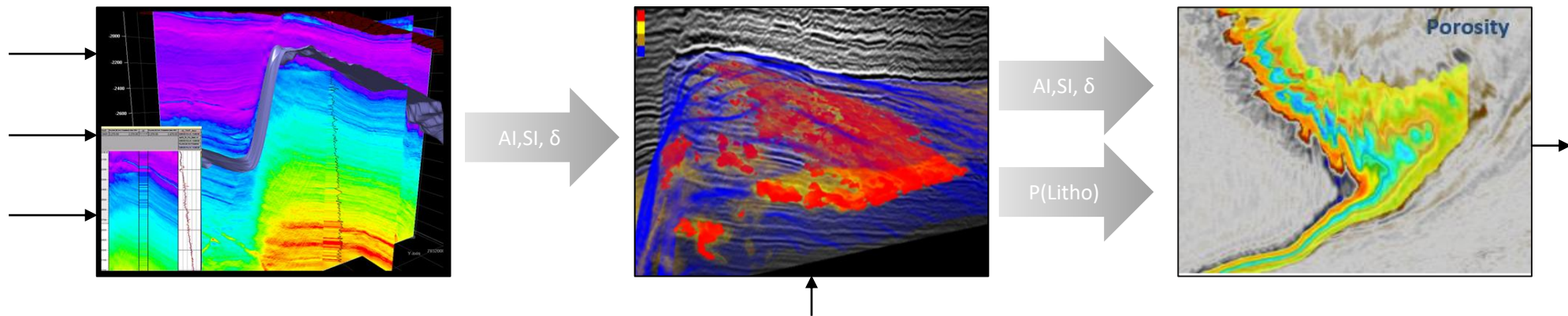
# Rock physics trend driven single loop inversion

- Building accurate low frequency prior models is often very challenging
  - Frontier exploration areas, channelized systems, structurally complex areas
- Low frequency trends are governed by geological processes
  - Mechanical compaction, geochemical alteration, cementation, etc.
- Rock Physics modelling and compaction trend analysis of the basin enable t amplitudes to lithology units and elastic properties



# LPE | Litho-Petro-Elastic inversion

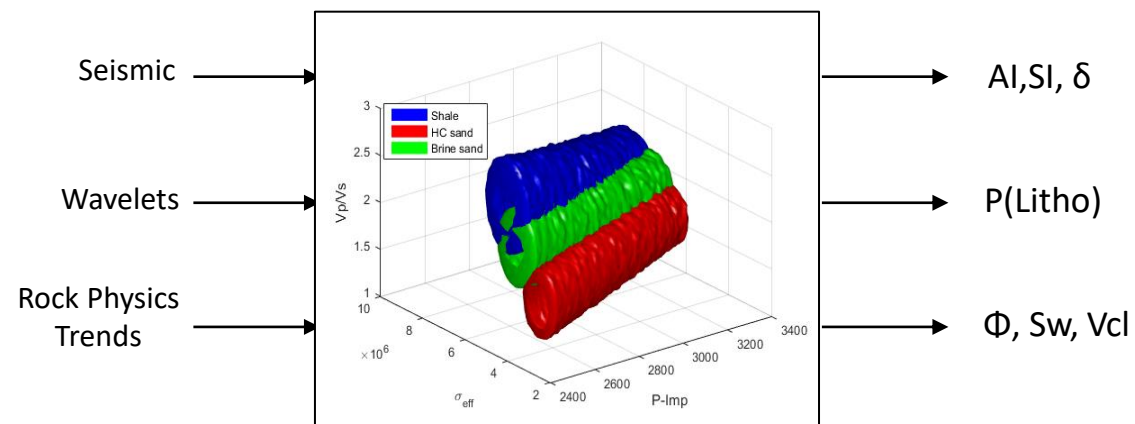
## Conventional 3-steps reservoir characterization workflow

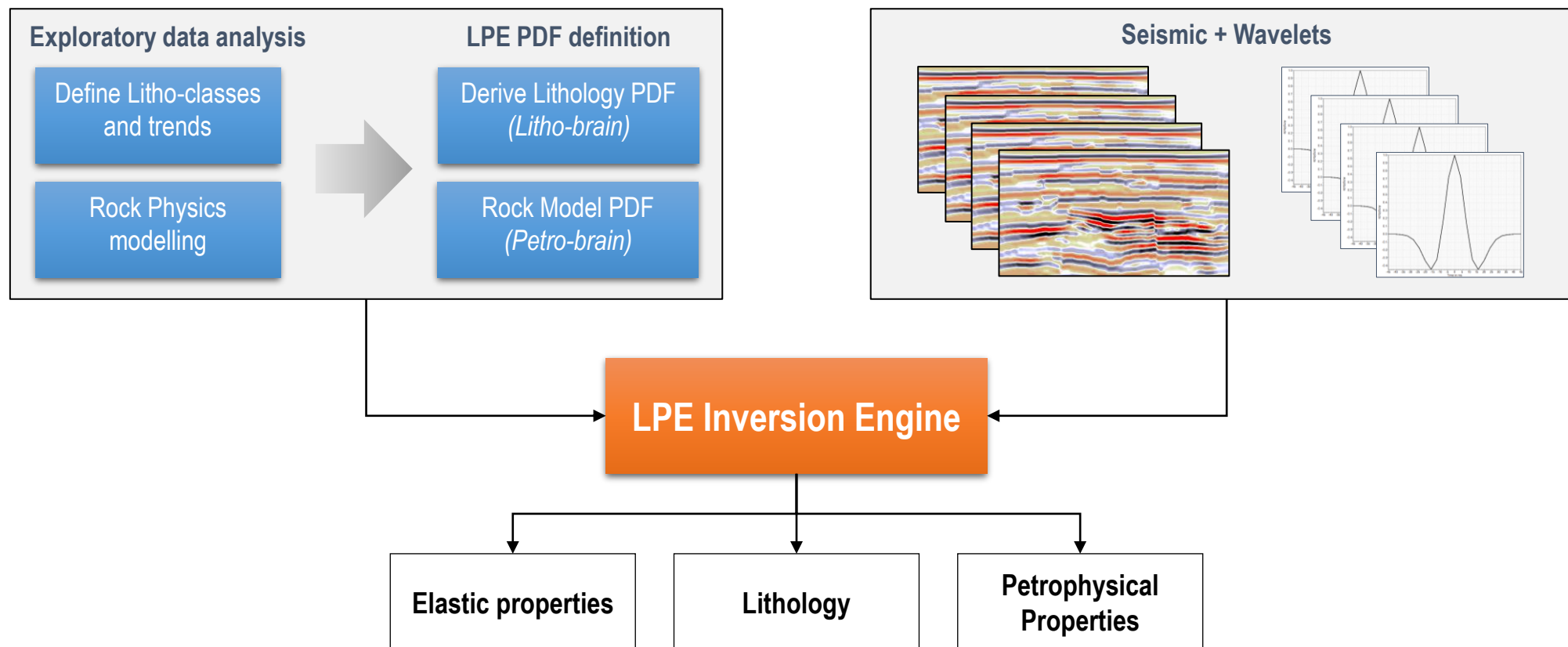


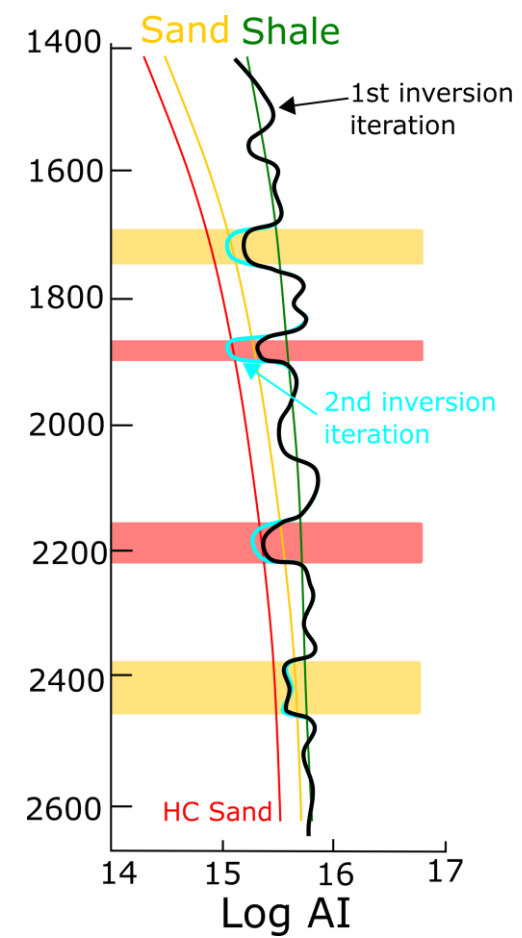
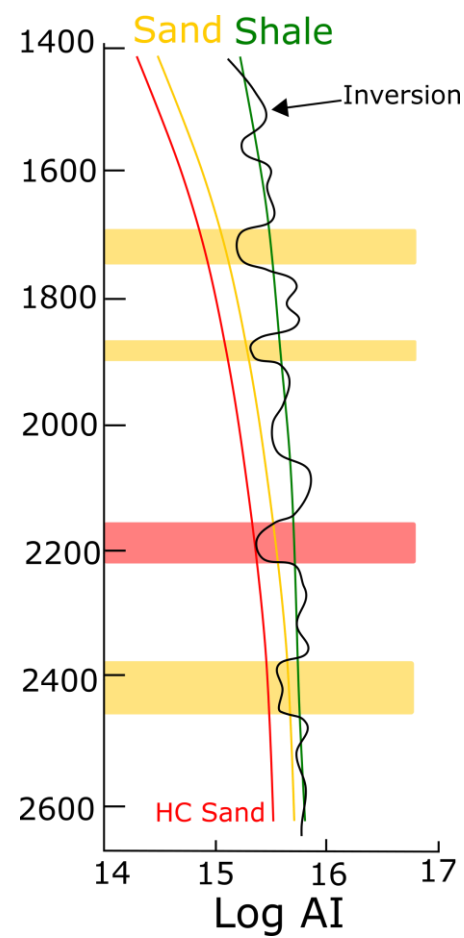
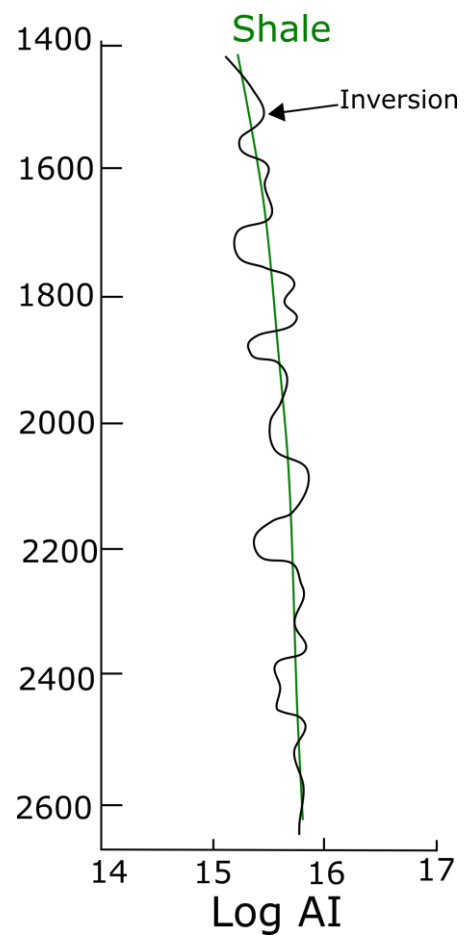
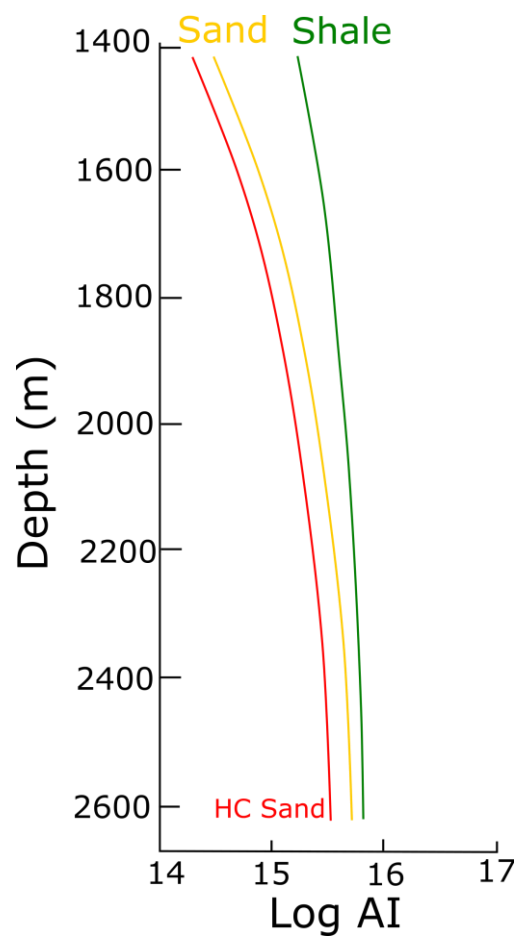
# LPE | Litho-Petro-Elastic inversion

Single-loop approach to seismic reservoir characterization

## Single-Loop Litho-Petro-Elastic inversion

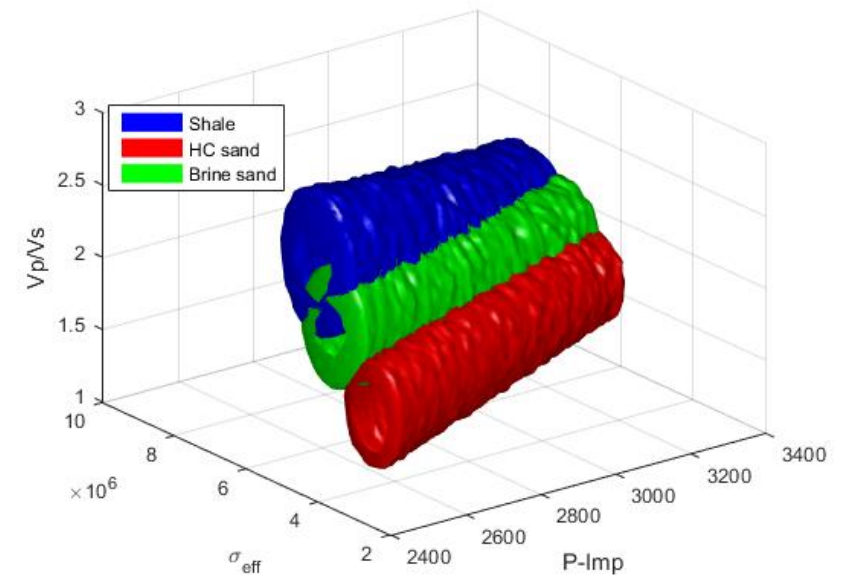






- 1D prior as opposed to 3D LFM
  - No horizons used. No interpolation of well logs
- Prior based on rock physics/ compaction trends per f
  - Inversion choses which prior to use based on facies estimates.
- Trends built using available wells in region
  - No need for wells to be within the survey
  - Quantity of wells much less crucial
- 3D LFM is an output as opposed to an input

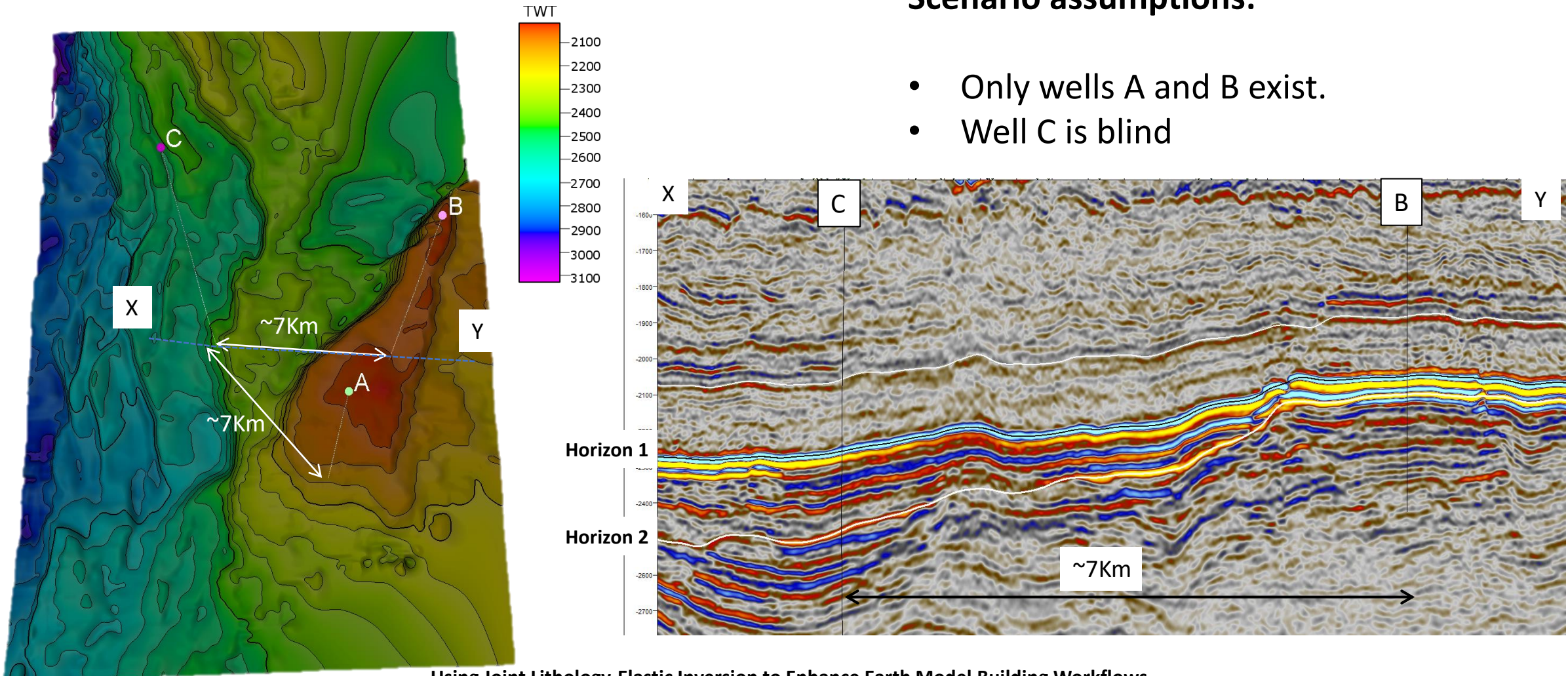
*P(Facies / P-Impedance, Vp/Vs, Effective stress trend)*



- Data assimilation framework - using **sequential filters** as inversion engine
  - Can easily integrate other models and measurements (PS data, AVAz etc.)
  - Linear and Non-Linear, anisotropic reflectivity operators
- Joint estimation of *lithologies*, *elastic* and *petrophysical* properties
  - **Compaction trend modelling** – no explicit definition of LFM
    - From simple 1D depth trends (based on depth and thermal gradients)...
    - ...to more complex scenarios (handles effective stress variations, estimated from seismic velocities or 3D basin modelling)
  - **Rock physics modelling** for petrophysical response
    - Stochastic modelling to estimate non parametric PDFs
    - Handles anisotropy (i.e. VTI shale anisotropy)

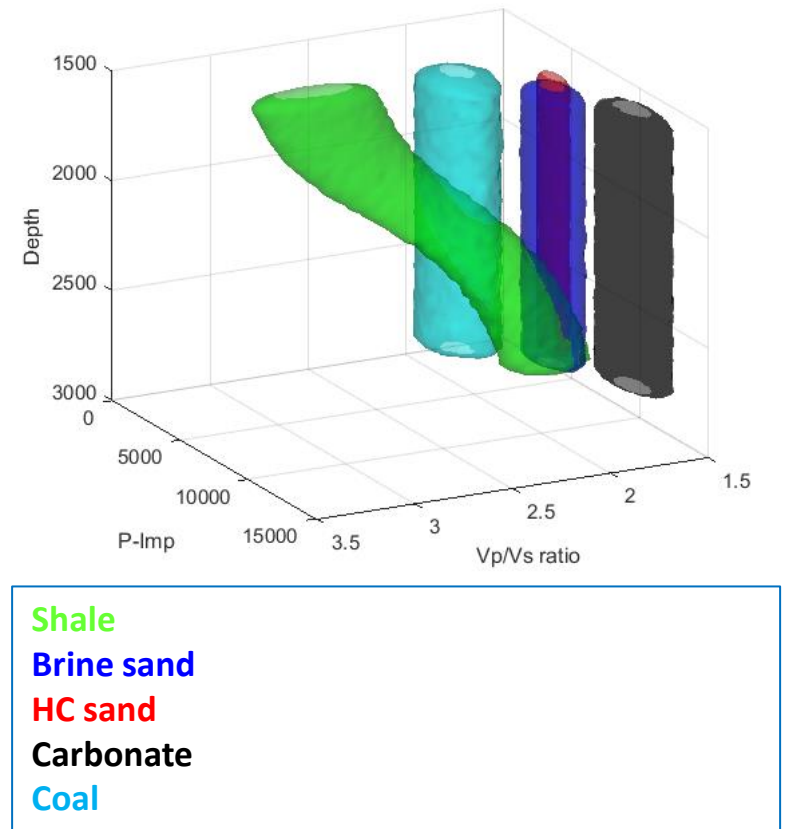
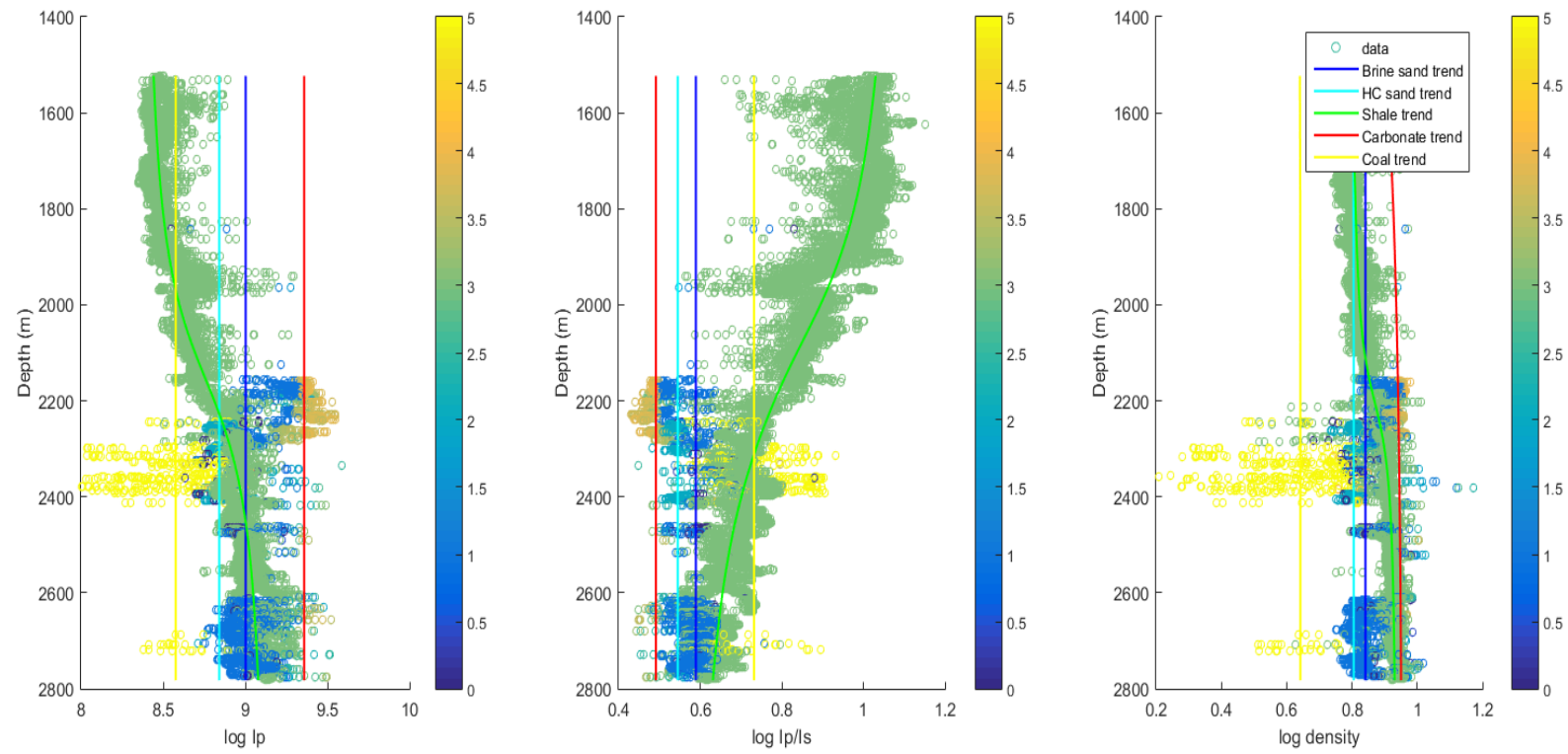
## Scenario assumptions:

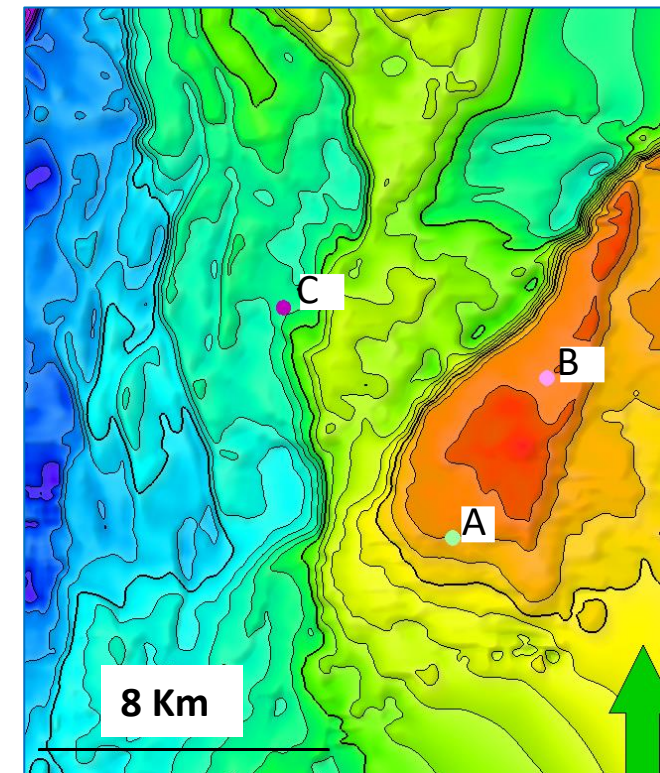
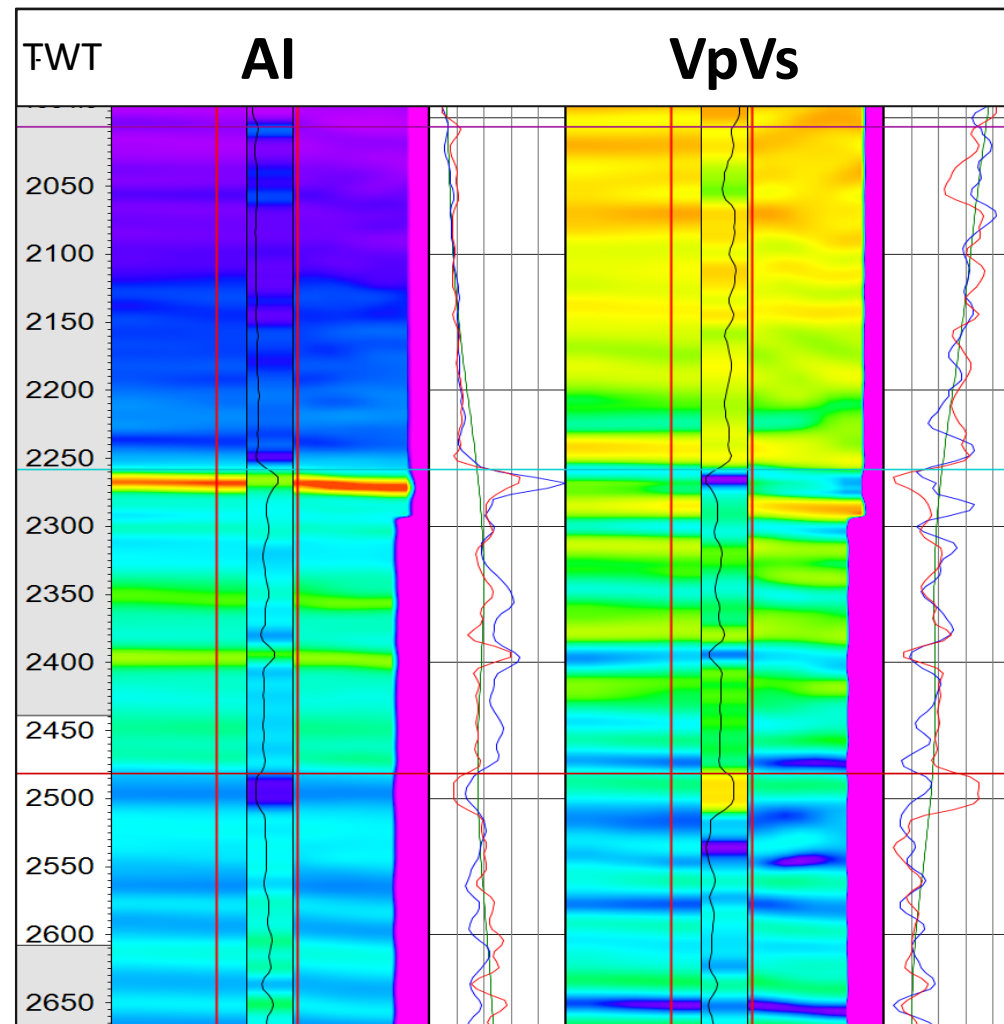
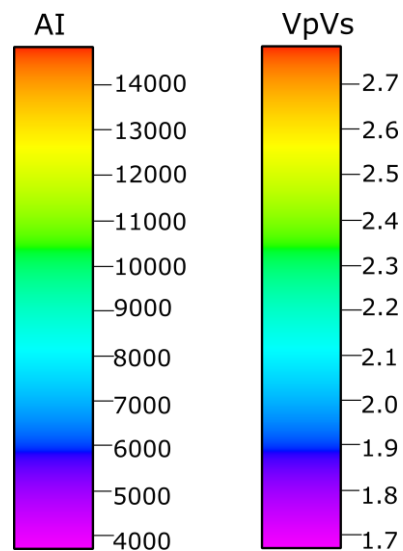
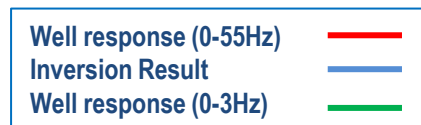
- Only wells A and B exist.
- Well C is blind



Using Joint Lithology-Elastic Inversion to Enhance Earth Model Building Workflows

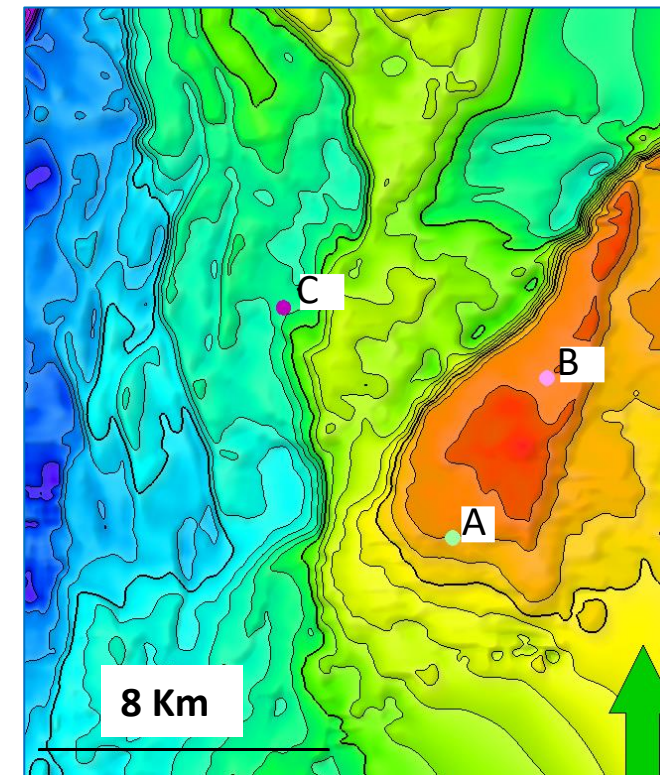
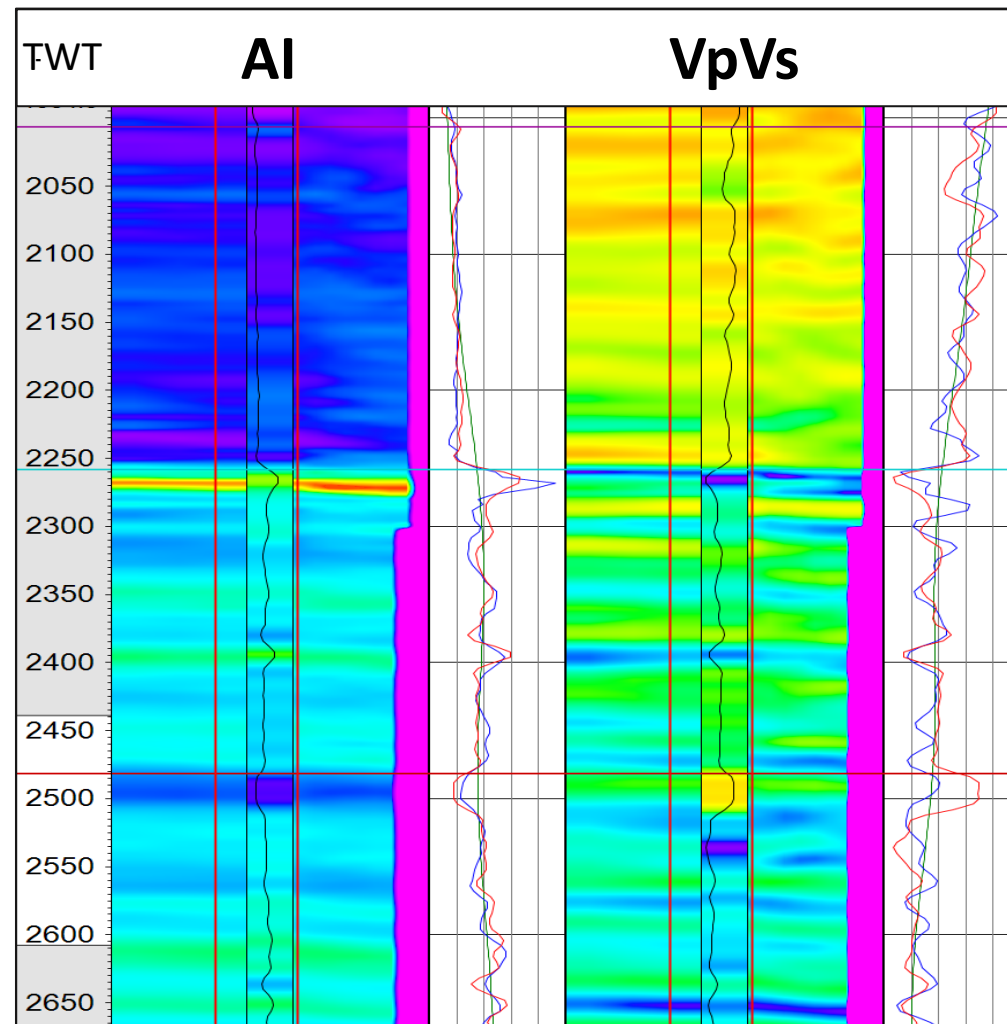
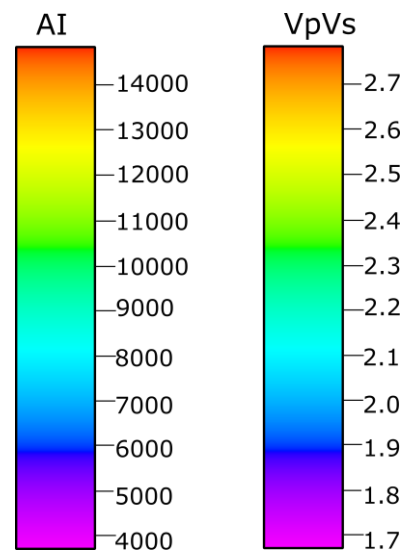
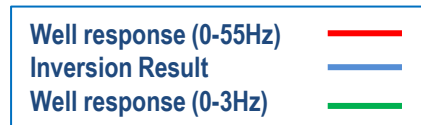
Barling, T., Bachrach, R., Leone, C., Chen, S. - 2nd EAGE/PESGB Workshop on Velocities, London 2019

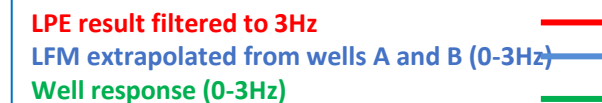
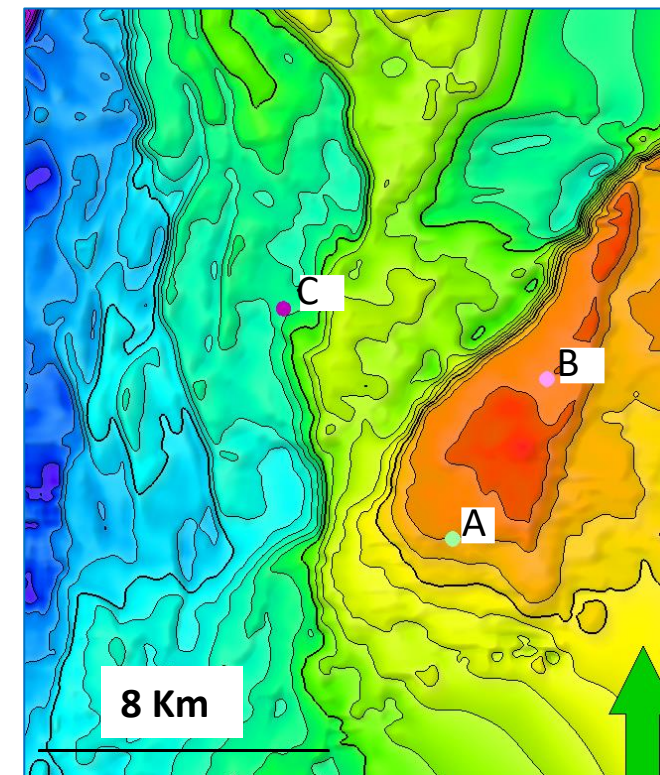
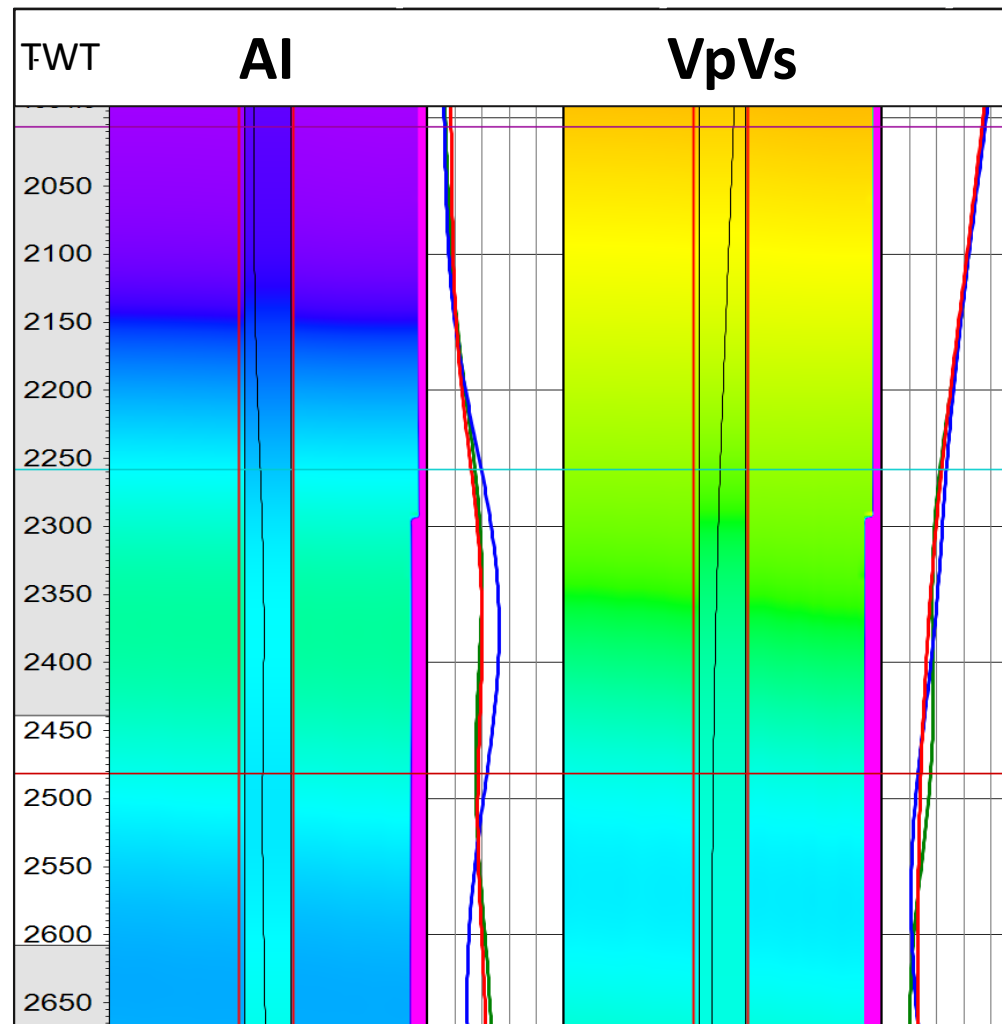
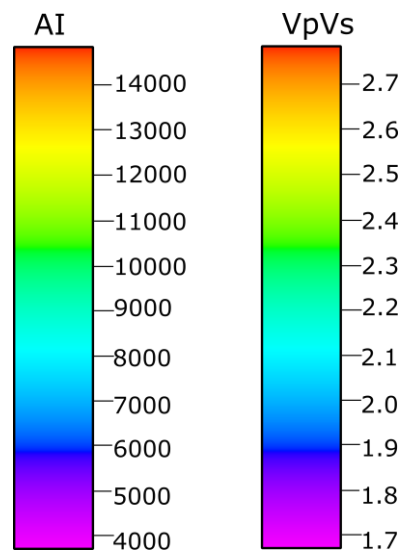
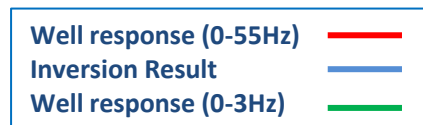


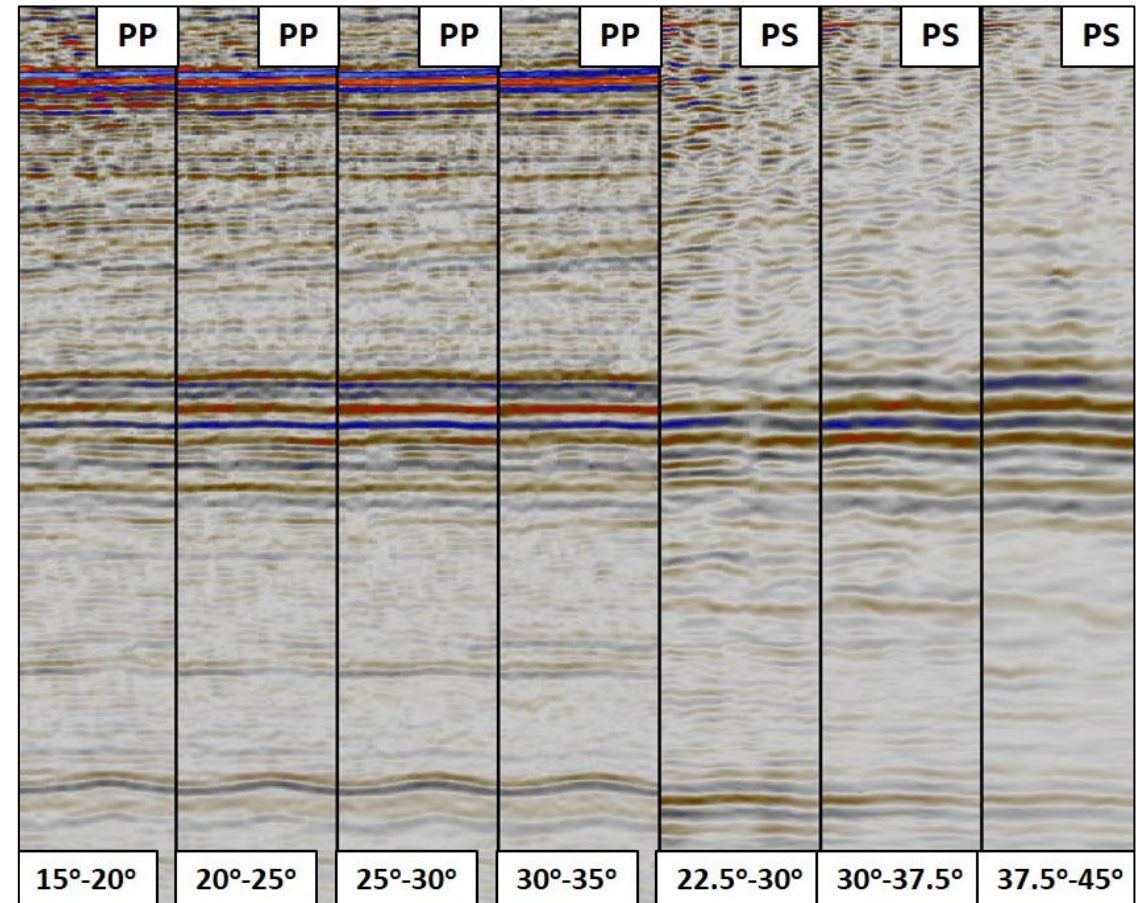
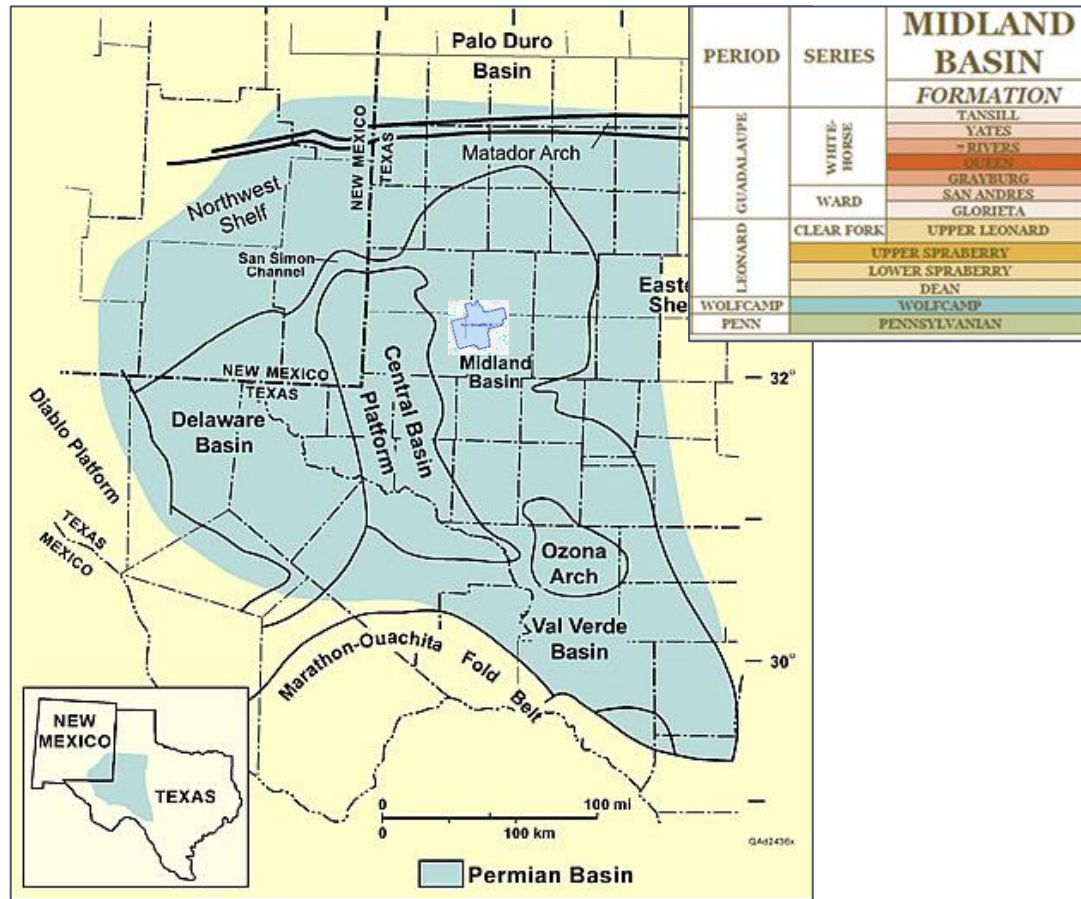


### Using Joint Lithology-Elastic Inversion to Enhance Earth Model Building Workflows

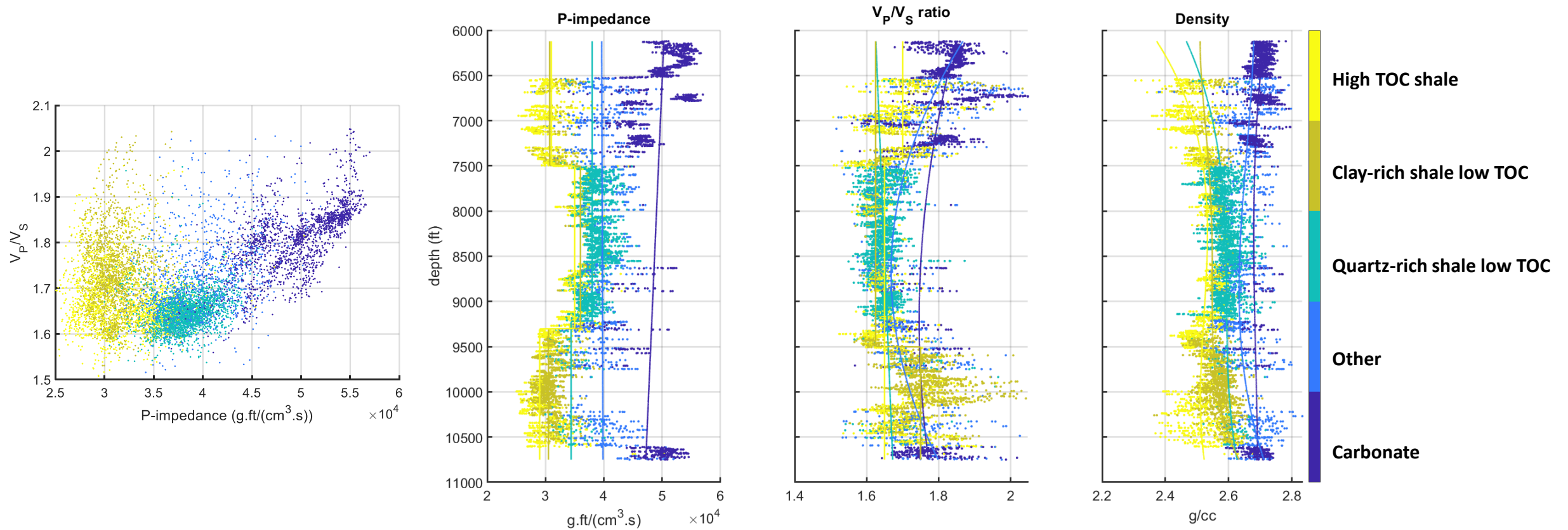
Barling, T., Bachrach, R., Leone, C., Chen, S. - 2nd EAGE/PESGB Workshop on Velocities, London 2019



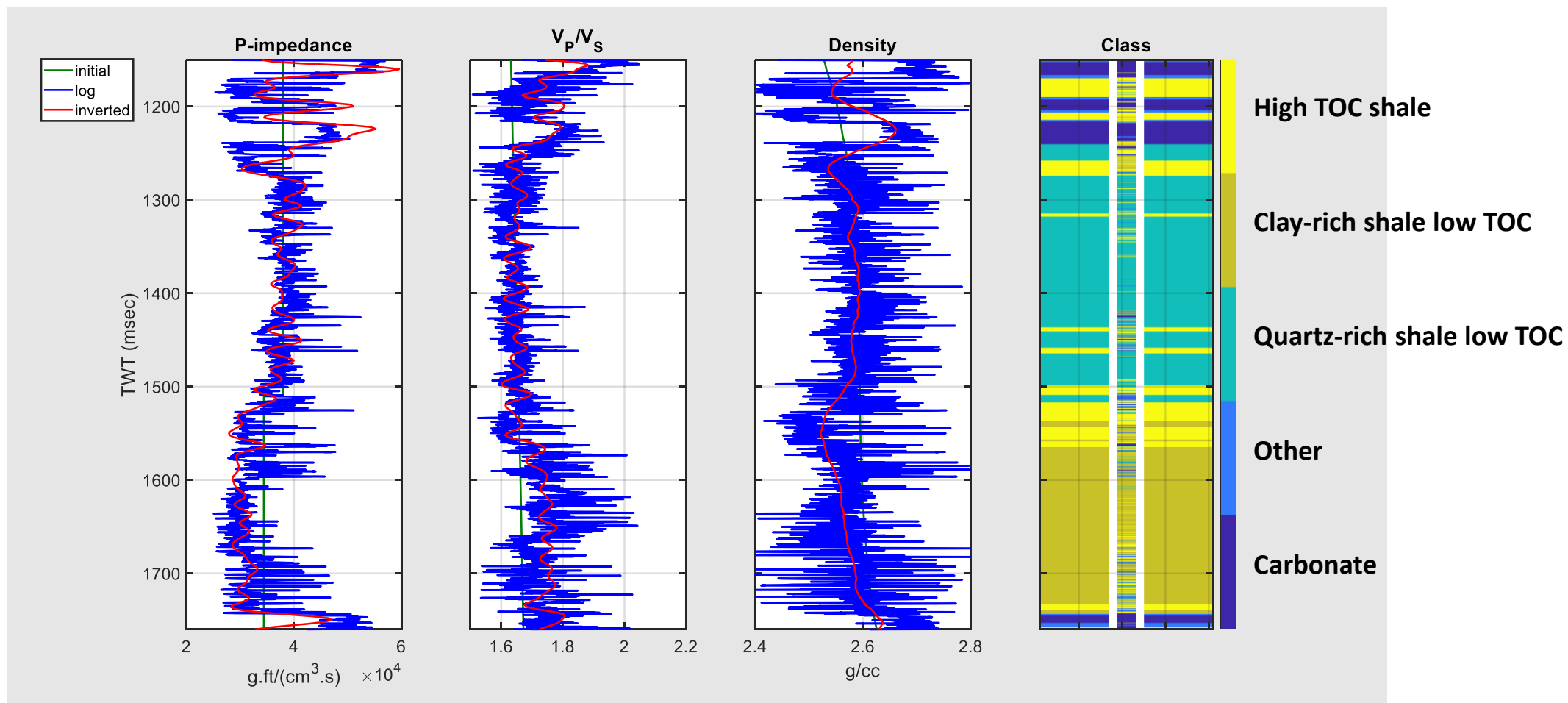




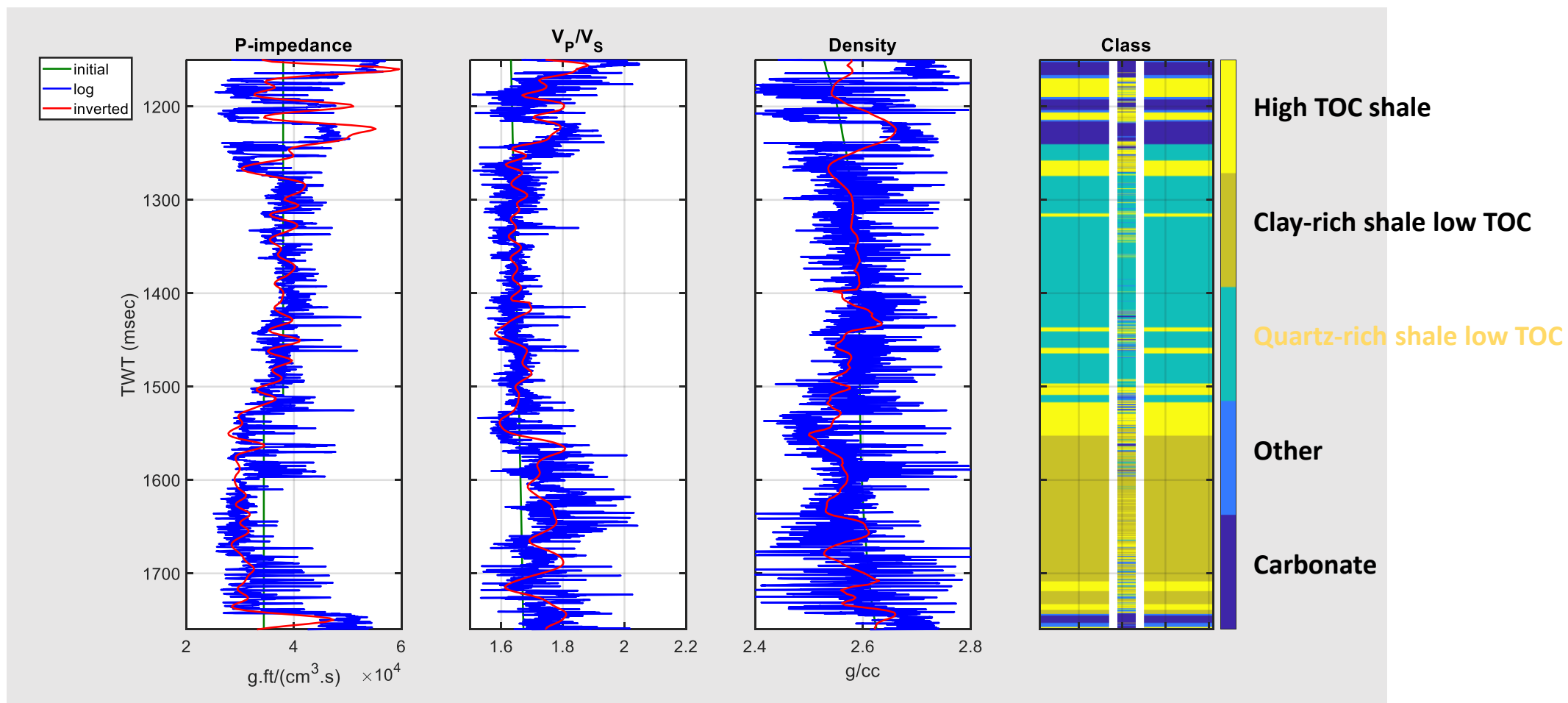
- 3D-3C survey, 844 km<sup>2</sup>; PP is depth migrated; PS is Time migrated
  - Ref: Brzostowski et al., 2019; Johns, 2018



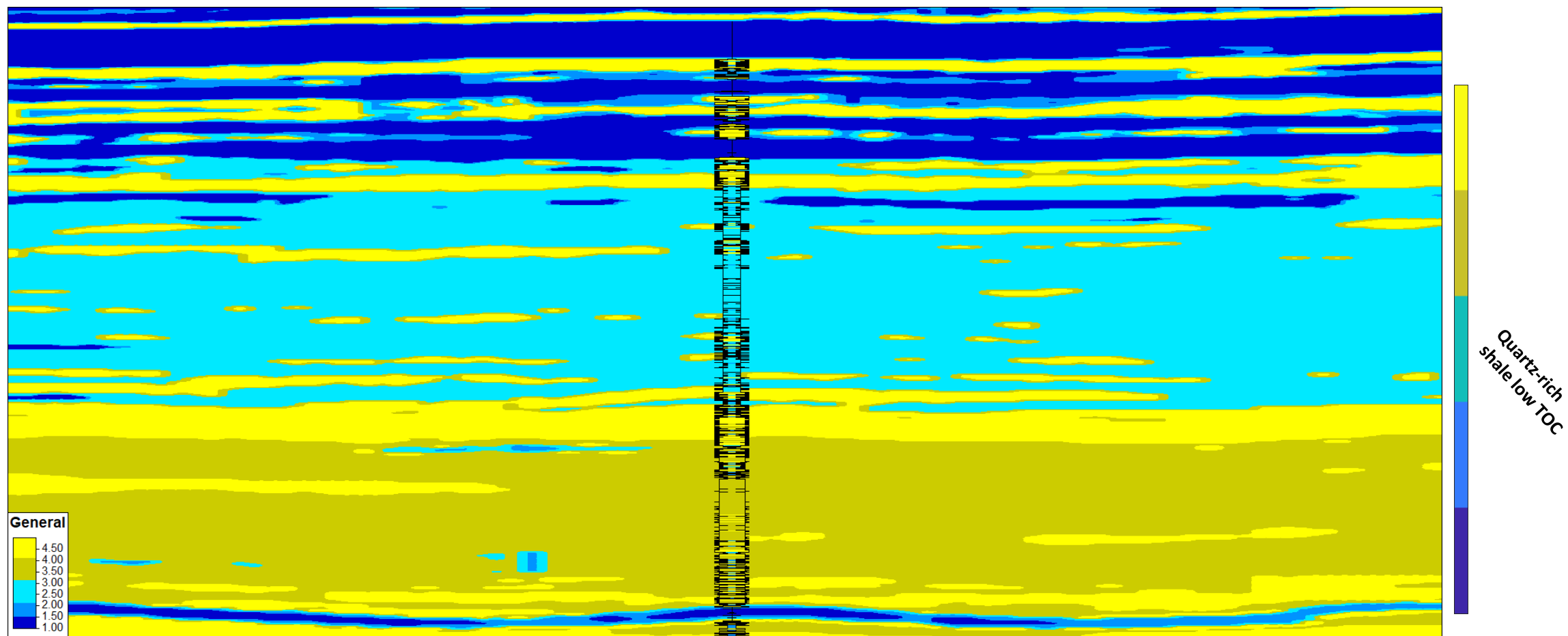
E. Gofer, R. Bachrach, S. Re, F. Golfre Andreasi (2019) Joint PP-PS litho-elastic AVA inversion: Example from Midland Basin; SEG Annual Conference



E. Gofer, R. Bachrach, S. Re, F. Golfre Andreasi (2019) **Joint PP-PS litho-elastic AVA inversion: Example from Midland Basin**; SEG Annual Conference



E. Gofer, R. Bachrach, S. Re, F. Golfre Andreasi (2019) **Joint PP-PS litho-elastic AVA inversion: Example from Midland Basin**; SEG Annual Conference

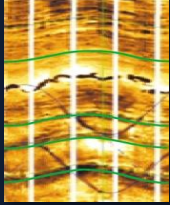
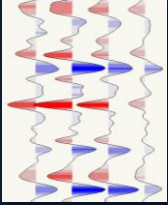
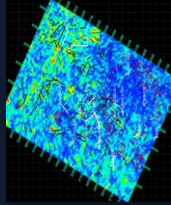
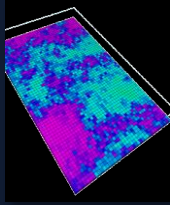

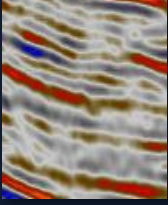
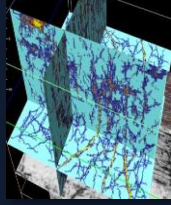
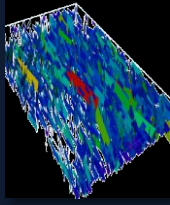


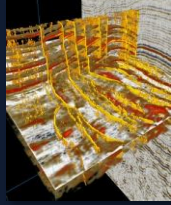
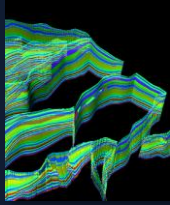


E. Gofer, R. Bachrach, S. Re, F. Golfre Andreasi (2019) **Joint PP-PS litho-elastic AVA inversion: Example from Midland Basin**; SEG Annual Conference

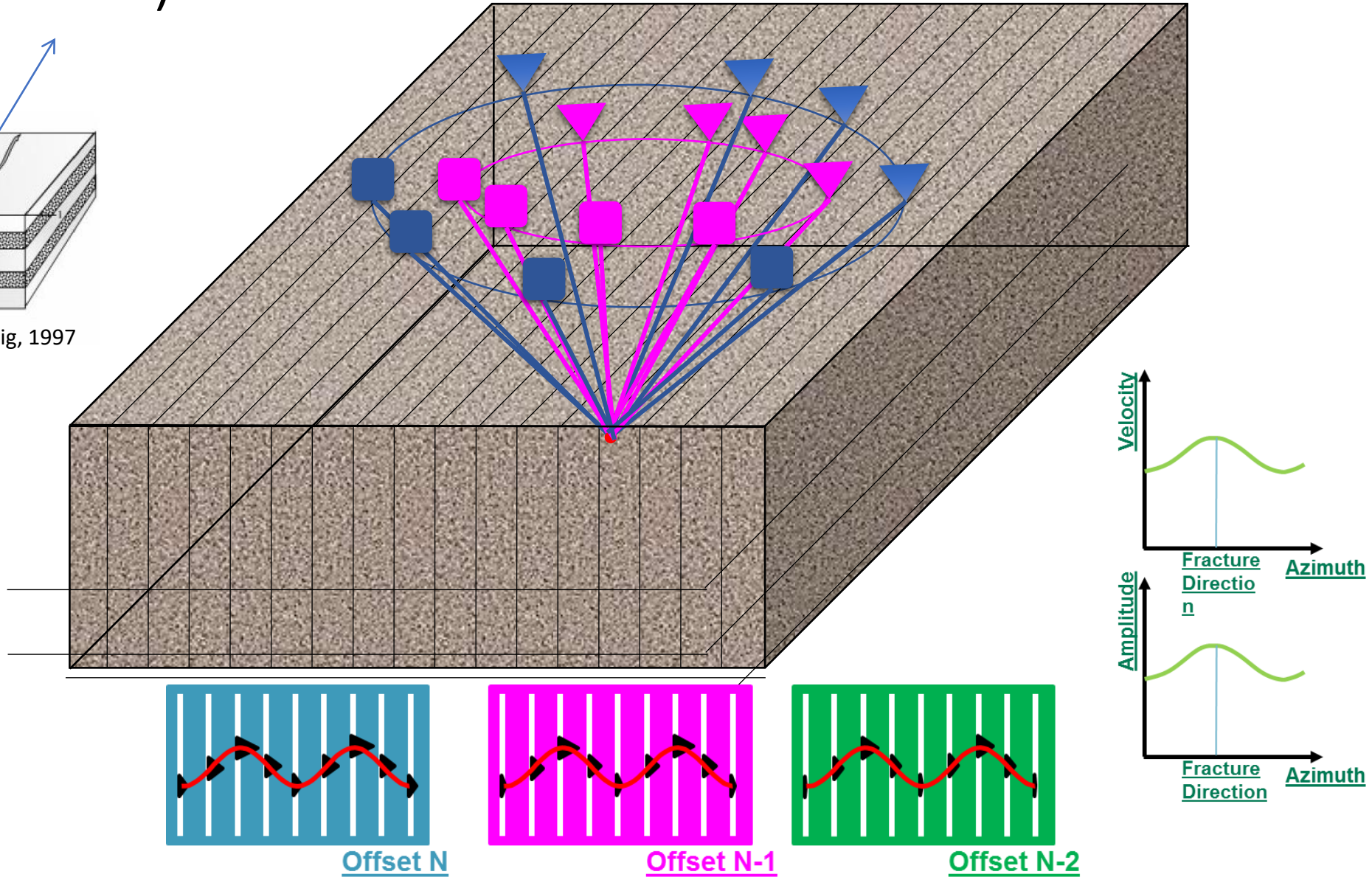
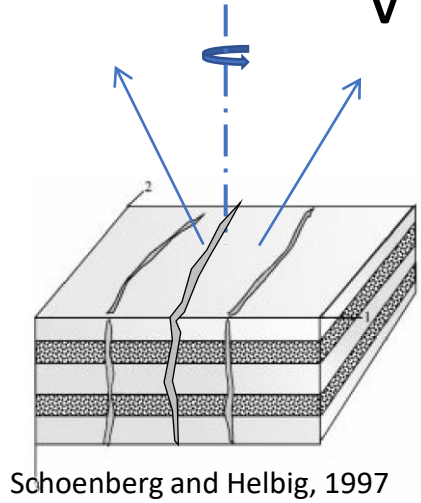


# Anisotropic Inversion for fracture estimation

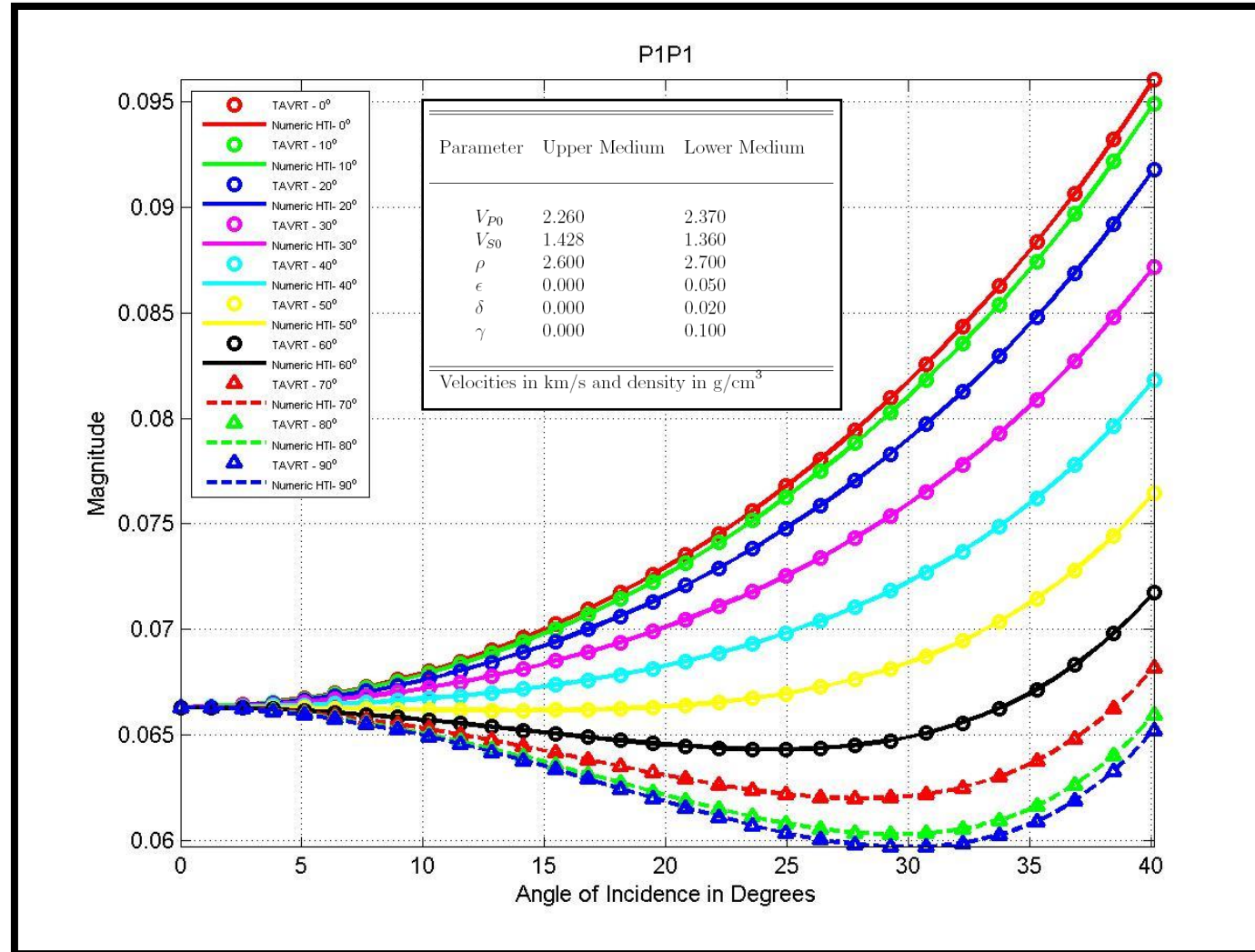
# Fracture Characterization: From Seismic to Simulation

	Geological Features	Seismic Observations	Data Analysis	Model Representations
Micro-Scale	 <b>Diffuse Fractures</b>	 <b>Seismic Anisotropy</b>	 <b>Anisotropy Analysis &amp; Inversion</b>	 <b>Implicit Fracture Model / DFN</b>
Meso-Scale	 <b>Fracture Corridors</b>	 <b>Subtle Discontinuities &amp; Scattering</b>	 <b>Fracture Cluster Mapping</b>	 <b>Fracture Patch Sets</b>
Macro-Scale	 <b>Faults</b>	 <b>Dislocated Horizons</b>	 <b>Ant Tracking, Fault Transmissivity</b>	 <b>Structural Faults</b>

# PP Seismic - Anisotropic Medium (HTI + VTI)



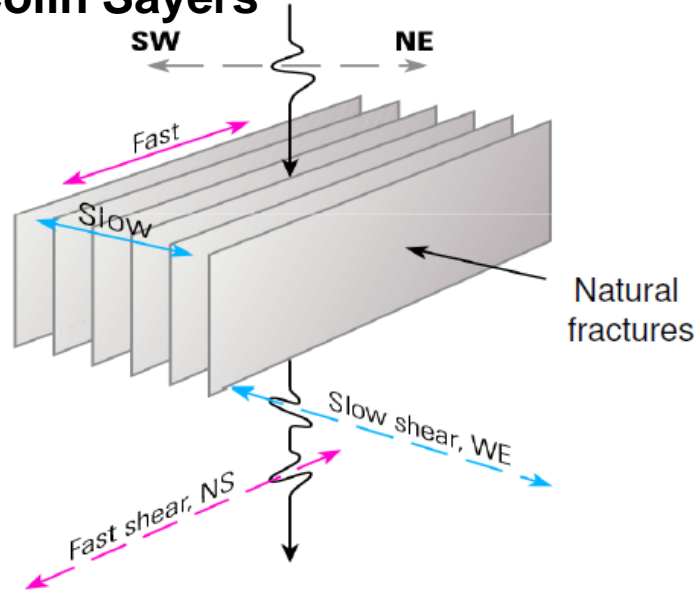
# PP-Reflection Coefficients in HTI Medium



# Petrel Simultaneous PP Azimuthal AVO

## Inversion

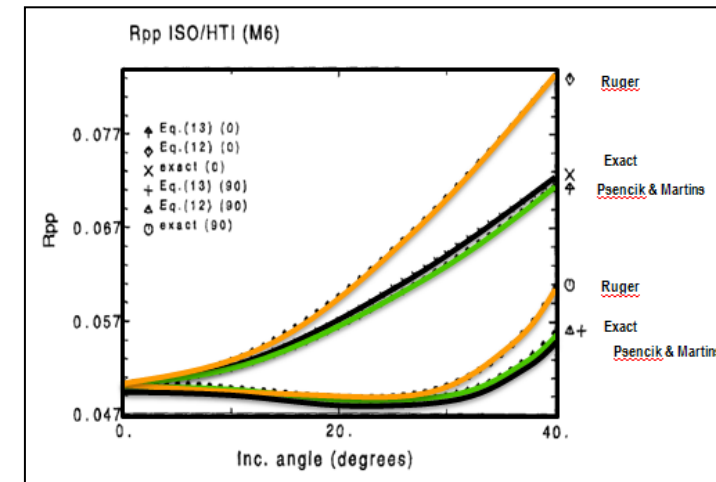
Colin Sayers



- Extend Petrel simultaneous AVO inversion to AVOaz for fracture characterization
- Use seismic azimuth dependent effective shear velocity in standard isotropic workflow
- Utilize fast and slow shear from SS/DSI
- Results in "SS/DSI-domain"
- Using the Psencik and Martins (2001)  $C_{ij}$  – based rather than Ruger (1997) Thomson parameter-based approximation

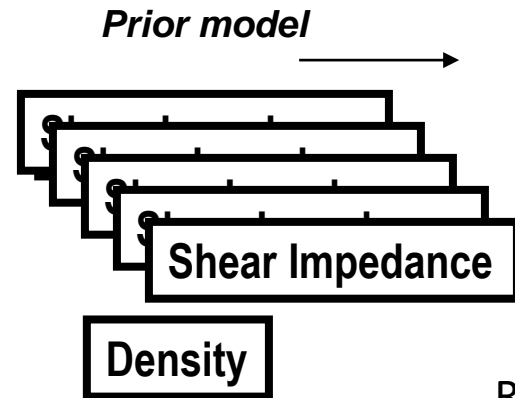
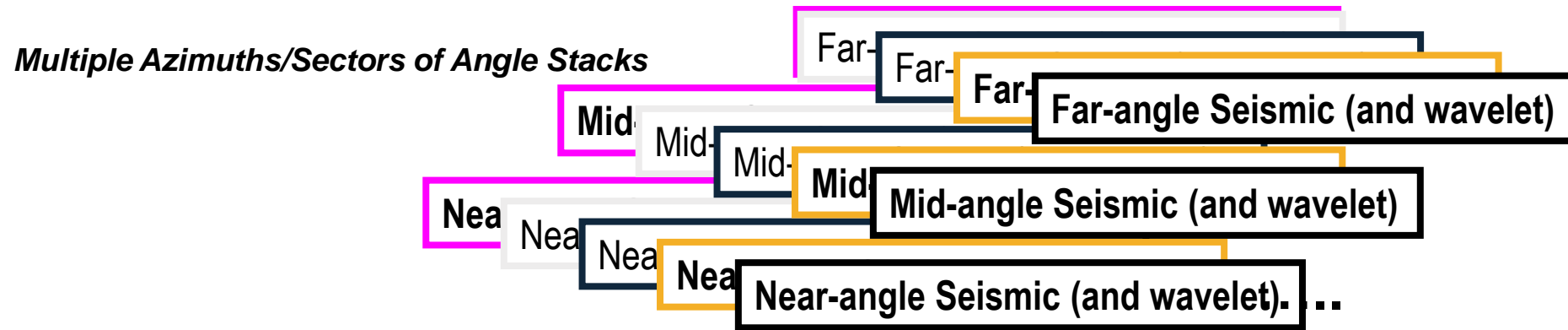
## Theory / Concept

- Stress and fractures combine to provide an azimuthally anisotropic velocities, and AVO response.
- Shear-Wave Splitting in Anisotropic Medium
- Shear wave polarized parallel to fractures is FAST
- Shear wave polarized perpendicular to fractures is SLOW



$$V_{s,eff} \approx \sqrt{\cos^2(\phi - \phi_{fast}) V_{s,fast}^2 + \sin^2(\phi - \phi_{fast}) V_{s,slow}^2}$$

# Petrel Simultaneous PP Azimuthal AVO Inversion (HTI)



**Petrel inversion kernel**

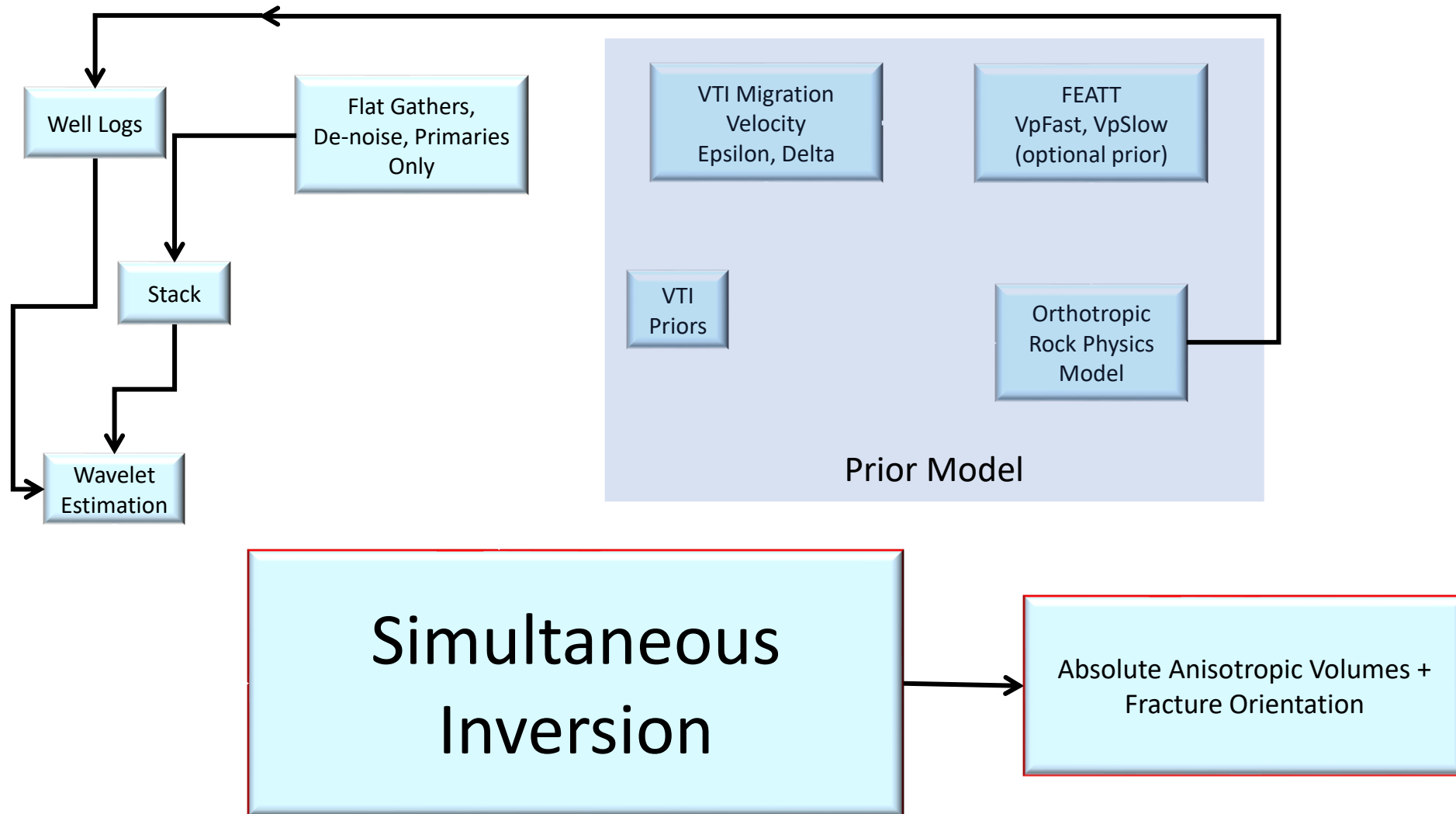
Result AI

Result Shear Impedance

Result Density

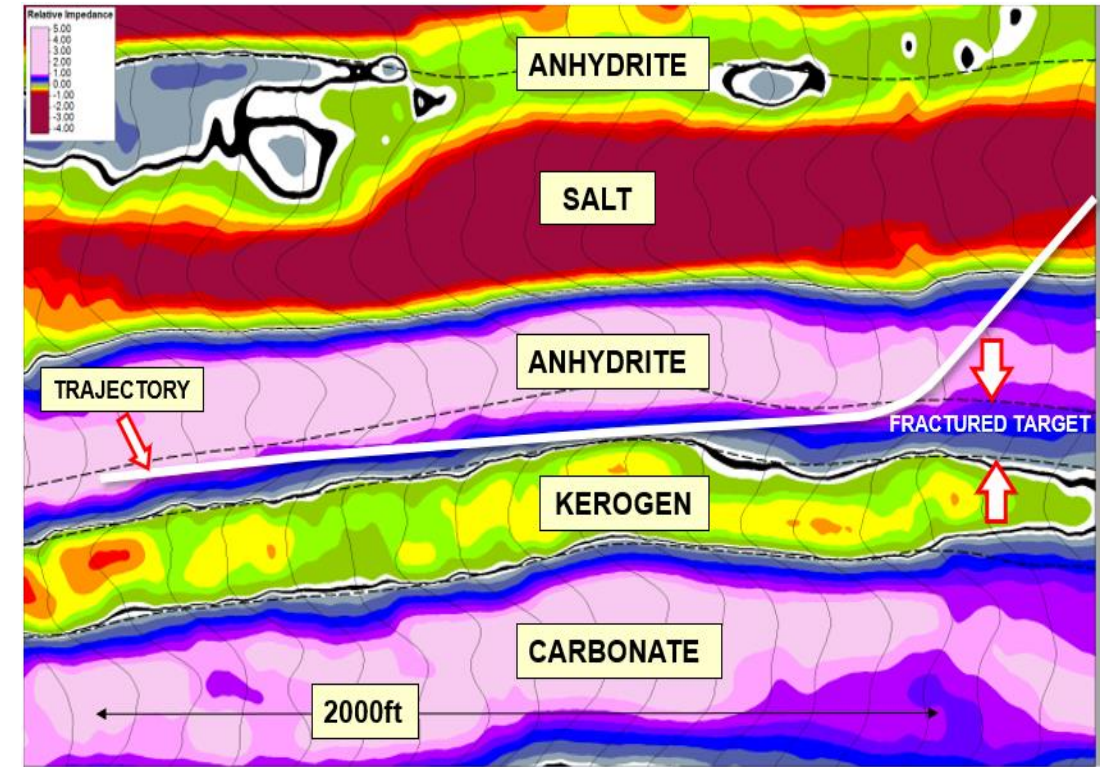
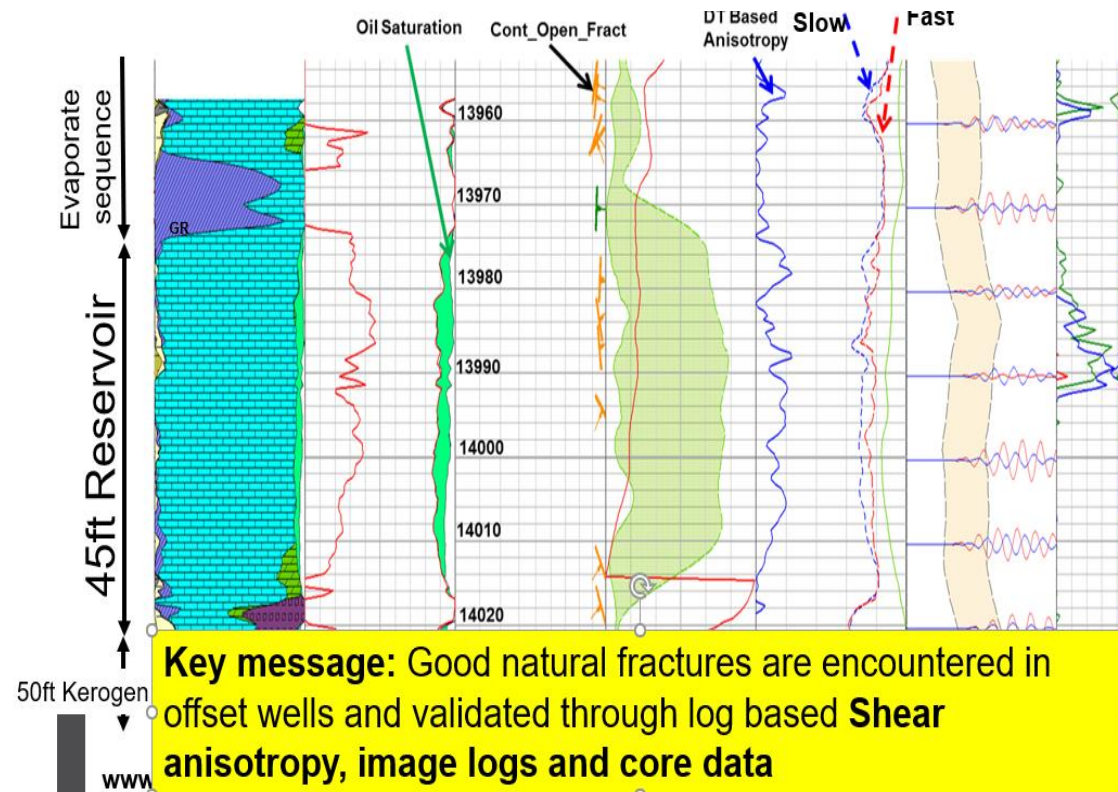
- Fast shear impedance, Poisson's ratio, Lambdarho, Murho
- Slow shear impedance, Poisson's ratio, Lambdarho, Murho
- Slow/fast shear ratio (fracture intensity)
- Fast shear azimuth (fracture orientation)

# Workflow Orth. SimInv



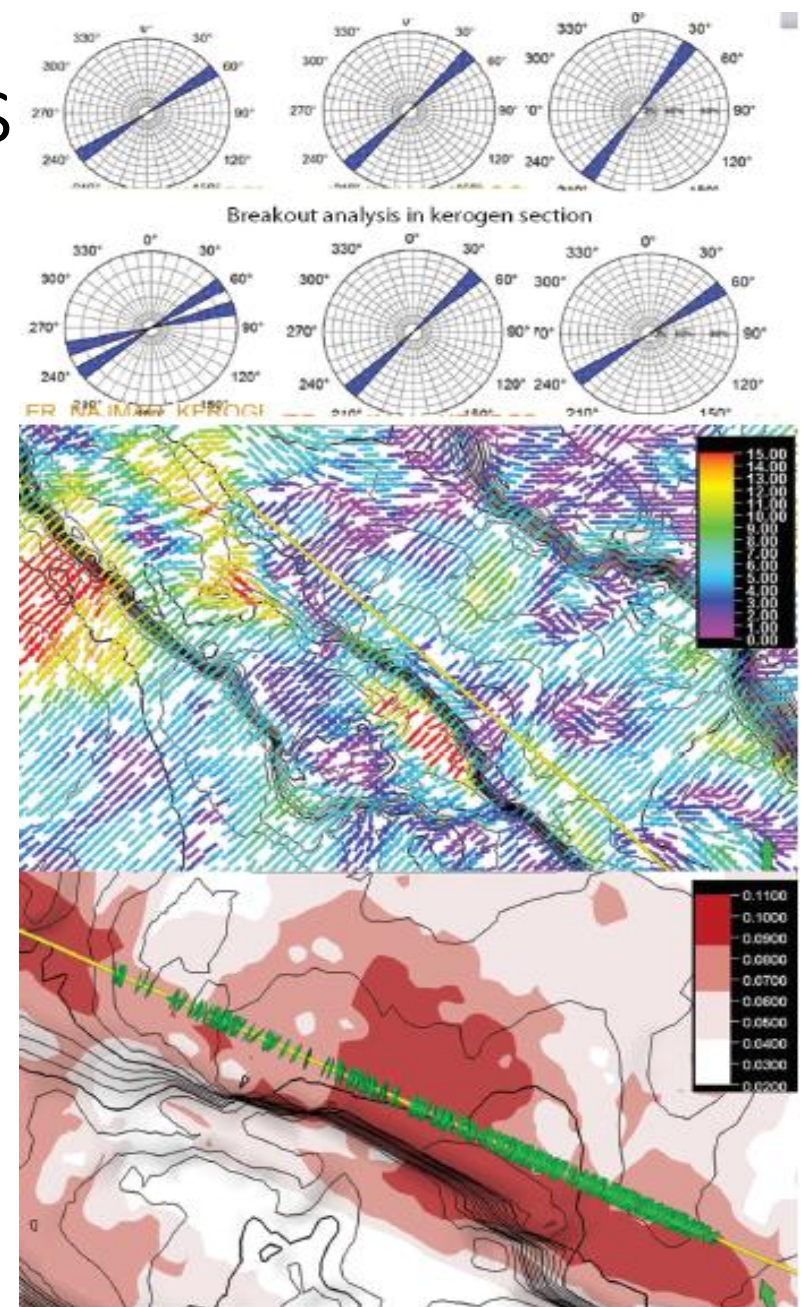
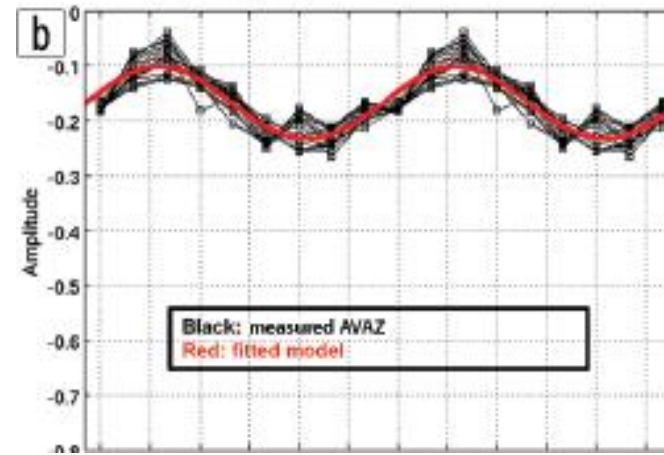
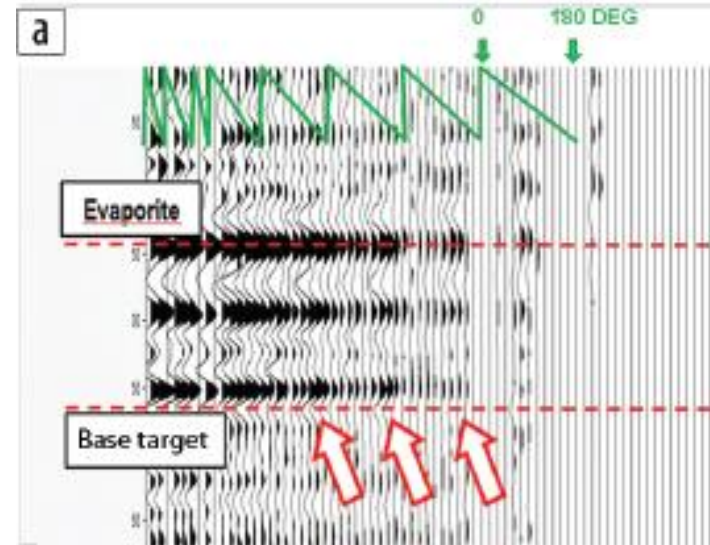
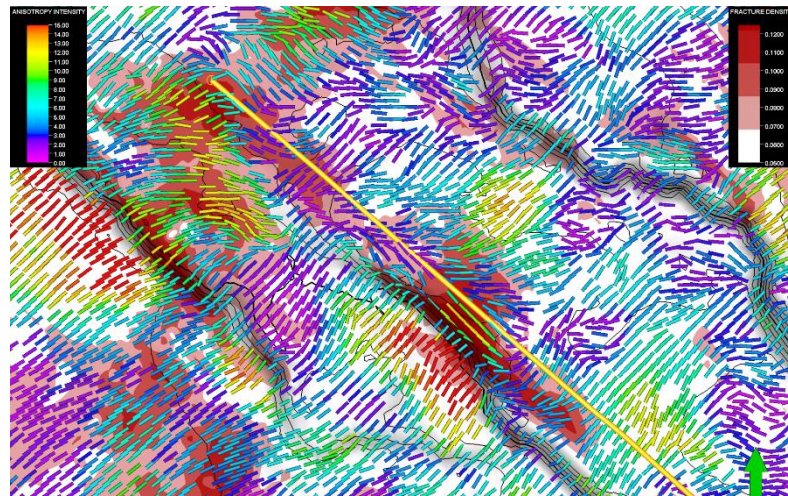
Bachrach et al (2013) inversion workflow suitable for layered media with vertically aligned fractures

# Shear wave anisotropy indicating presence of open fractures: offset well



Narhari et al., *The Leading Edge*, Dec. 2015

# Natural Fracture Density Fracture Orientation with Anis Contrast

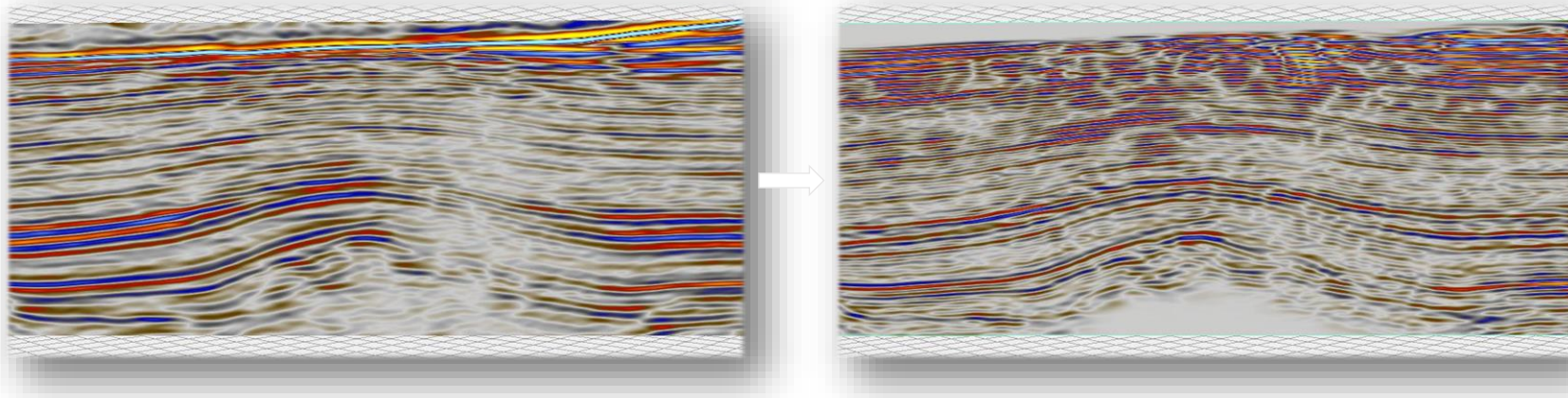




# Depth Domain Inversion

# Introduction

- ❑ Finite acquisition geometries and overburden complexity cause variable illumination effects in the depth-migrated images and gathers
  - ✓ negative impact on both qualitative (structural) and quantitative interpretation



- ❑ DDI can help mitigate the imprint of variable illumination

# Deriving earth properties through image-domain LSM

- ❑ Image-domain LSM:

$$I = H r \quad \text{with} \quad H = M_{mig} M_{mod}$$

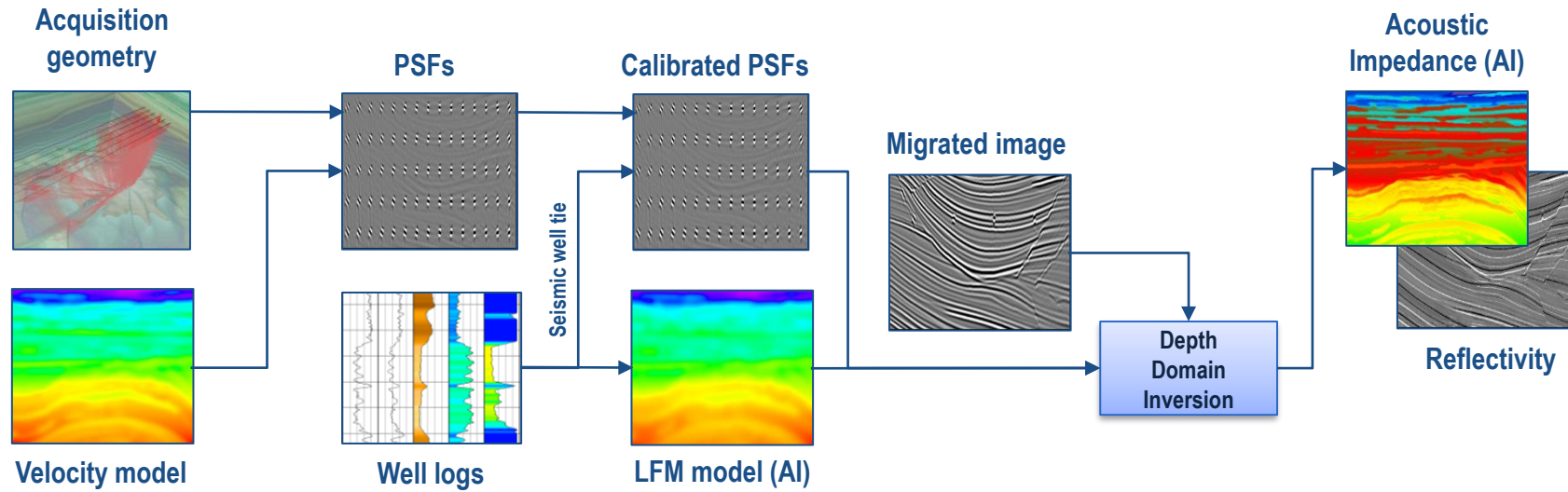
- ❑ Depth-domain inversion (Fletcher et al, 2012):

$$I = H R(m)$$

- ✓  $R$  : reflectivity operator (prestack, poststack, linear, non-linear..)
- ✓  $m$  : earth properties (acoustic impedance,  $V_p/V_s$ , density)

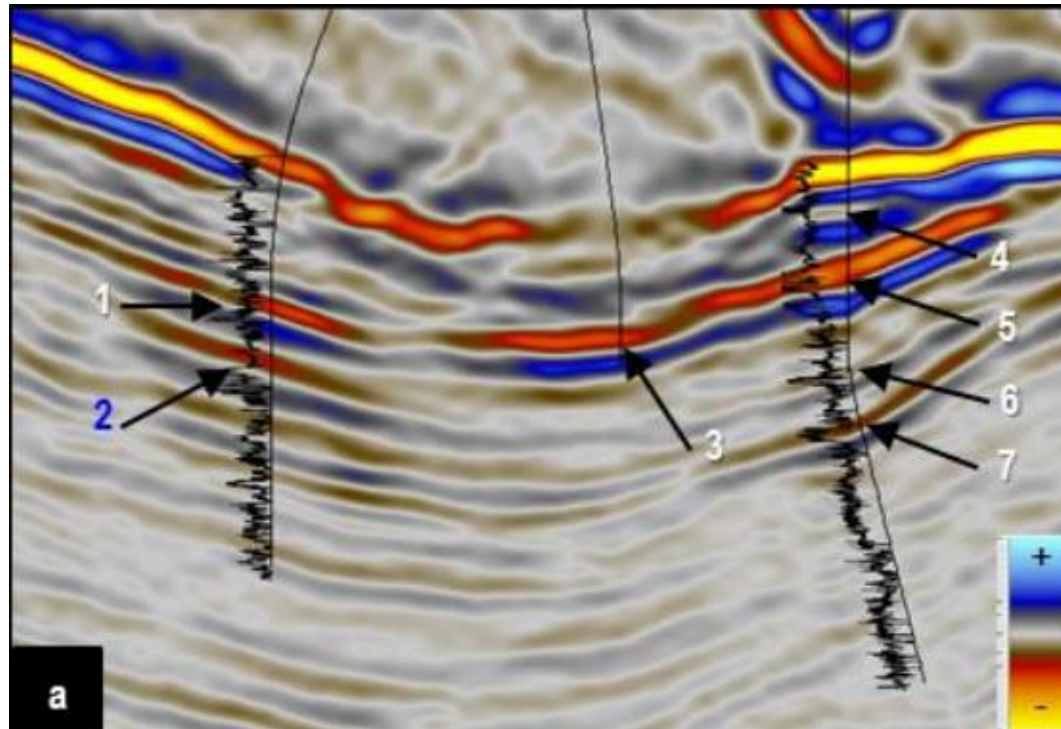
- ❑ Iterative deconvolution (with constraints)

# General workflow (poststack)



# Example 1 | Mississippi Canyon, Gulf of Mexico

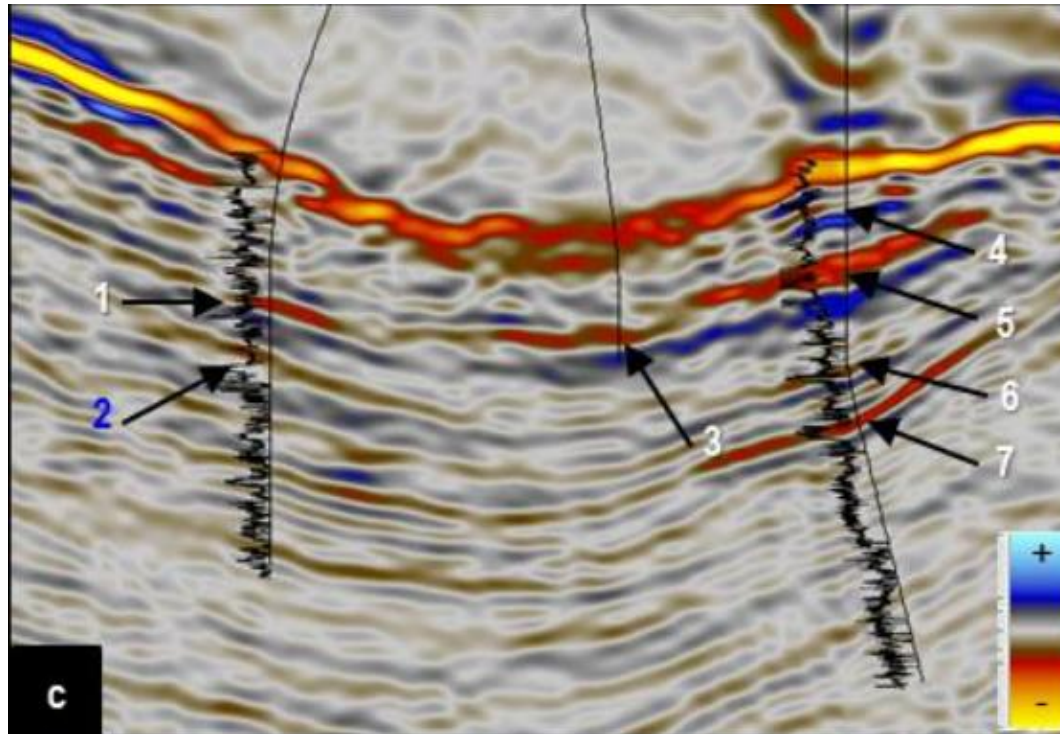
RTM image



- ✓ Thin sands located just below salt structure
- ✓ Arrows denote hydrocarbon sands except #2 (brine sands)

# Example 1 | inverted reflectivity

LSMi with calibration

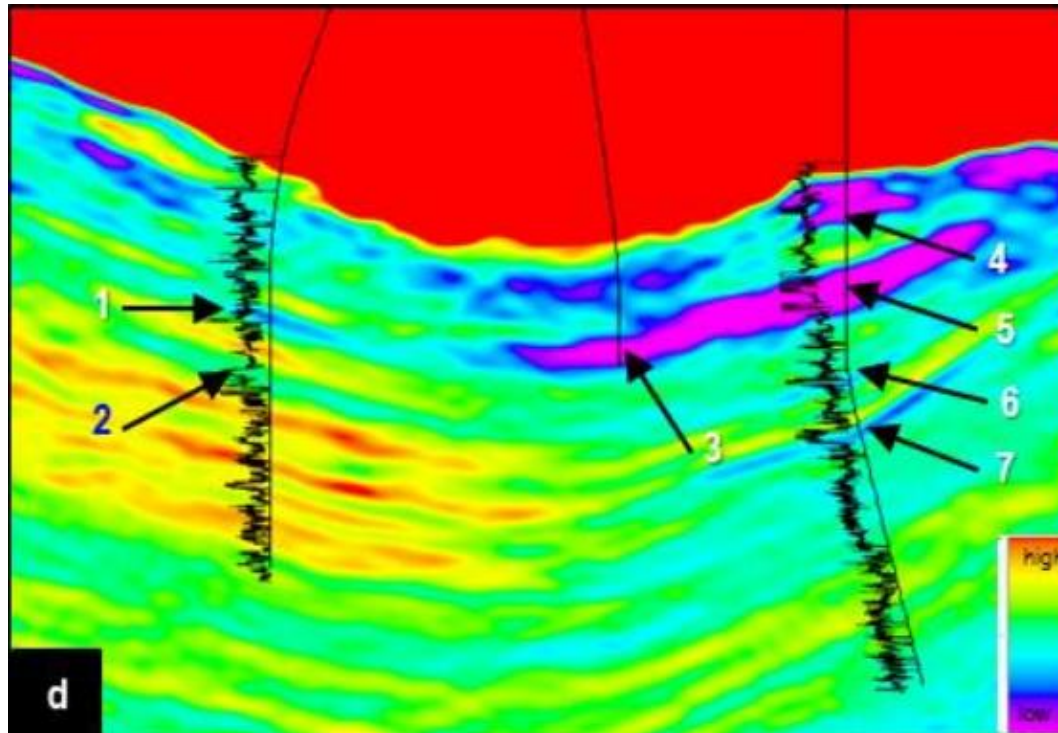


- ✓ much-enhanced amplitude balancing
- ✓ higher resolution

REF: Leon, L., Inyang, C., Hegazy, M., Hydal, S., Hargrove, K., Pasch, K. and Hollins, J. 2018. Least-squares migration in the image domain and depth-domain inversion: A Gulf of Mexico case study. 88th Annual International Meeting, SEG, Expanded Abstracts.

# Example 1 | acoustic impedance

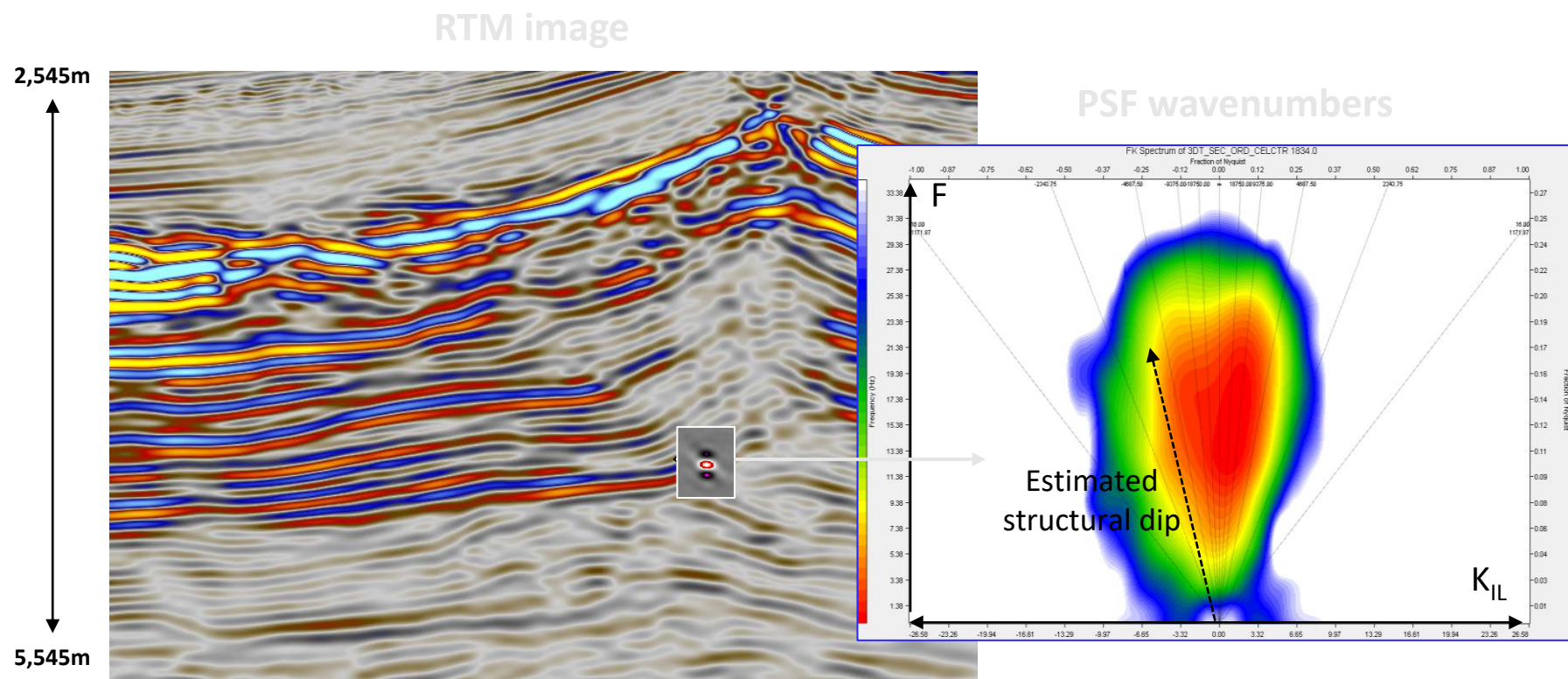
Depth Domain Inversion



✓ acoustic impedance at brine sands (#2) much more reliable!

REF: Leon, L., Inyang, C., Hegazy, M., Hydal, S., Hargrove, K., Pasch, K. and Hollins, J. 2018. Least-squares migration in the image domain and depth-domain inversion: A Gulf of Mexico case study. 88th Annual International Meeting, SEG, Expanded Abstracts.

## Example 2 | Brazil Santos Basin

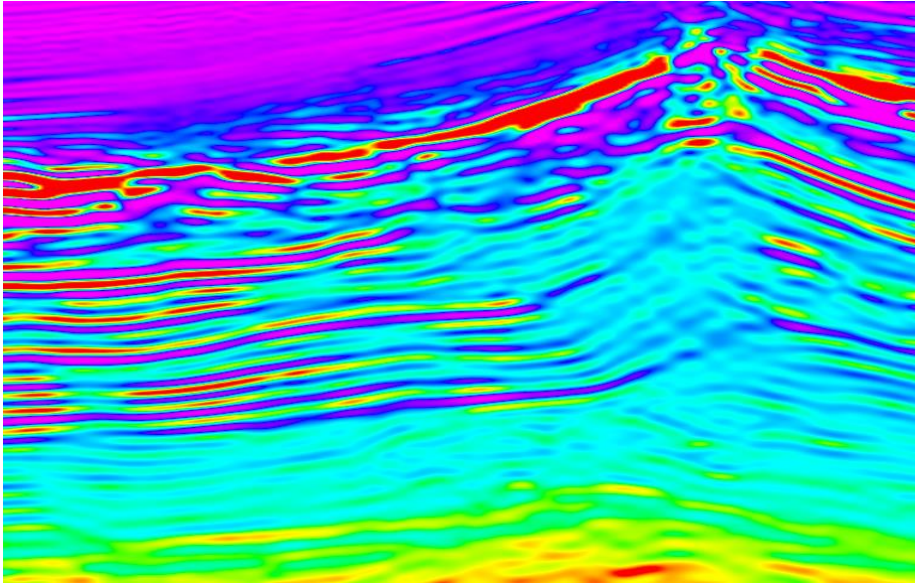


- ✓ Thick and layered salt body
- ✓ Significant dip-dependent illumination variations

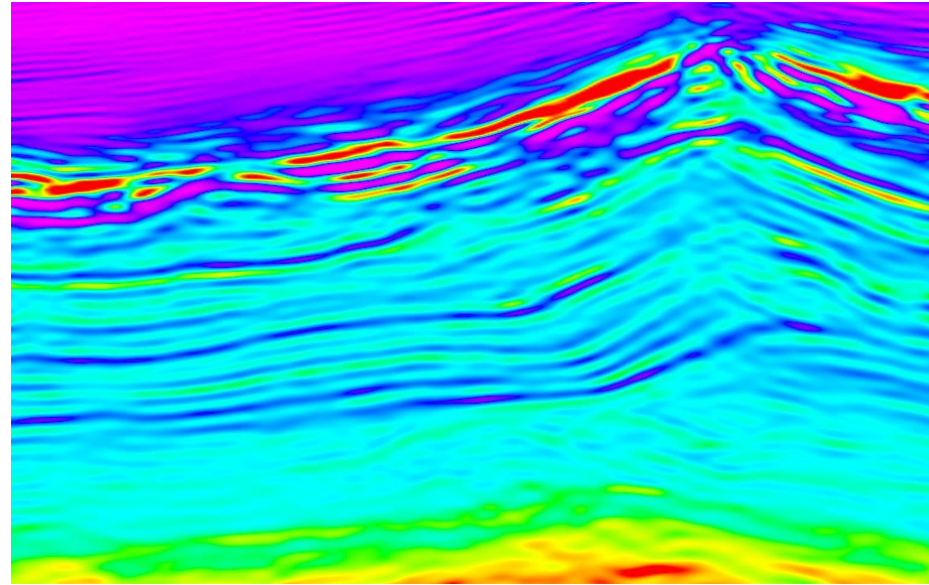
**REF:** Letki, L., Darke, K., and Araujo Borges, Y. 2015b. A comparison between time domain and depth domain inversion to acoustic impedance. 85th Annual International Meeting, SEG, Expanded Abstracts.

## Example 2 | acoustic impedance

CONVENTIONAL TIME-DOMAIN INVERSION



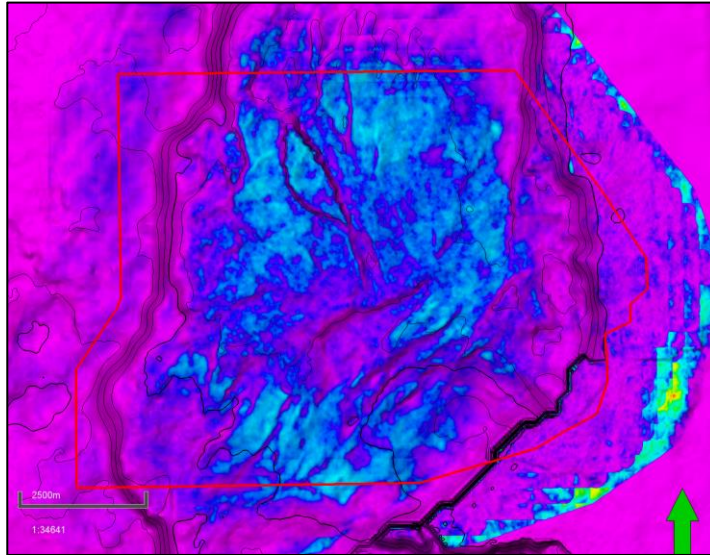
DEPTH-DOMAIN INVERSION



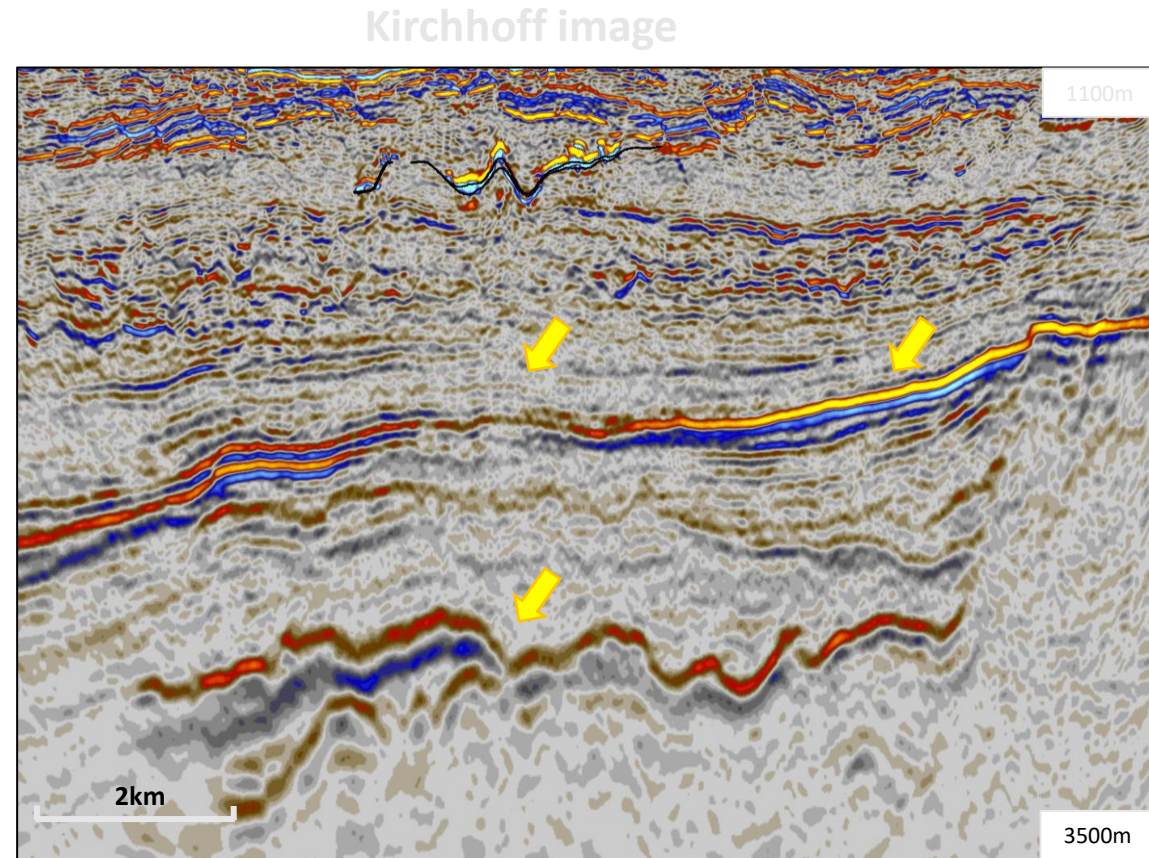
- ✓ 3D PSFs capturing space and dip-dependent illumination effects, leading to more continuous and reliable acoustic impedance

**REF:** Letki, L., Darke, K., and Araujo Borges, Y. 2015b. A comparison between time domain and depth domain inversion to acoustic impedance. 85th Annual International Meeting, SEG, Expanded Abstracts.

## Example 3 | Ivar Aasen Field, North Sea

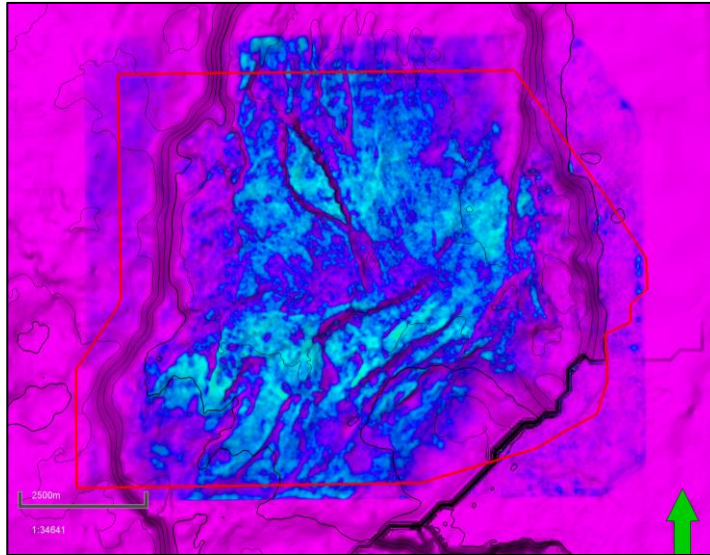


RMS amplitude map

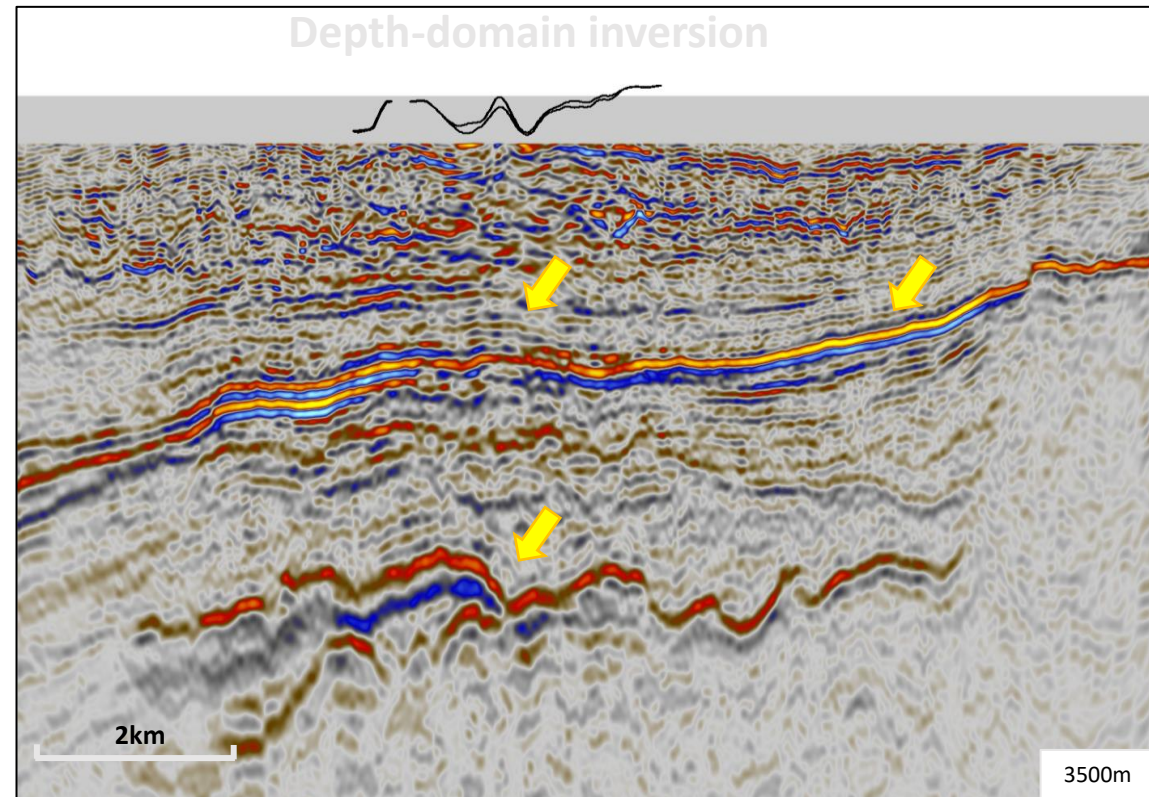


- ✓ Sand injectites creating strong illumination imprint on the reservoirs underneath

## Example 3 | inverted reflectivity (poststack)

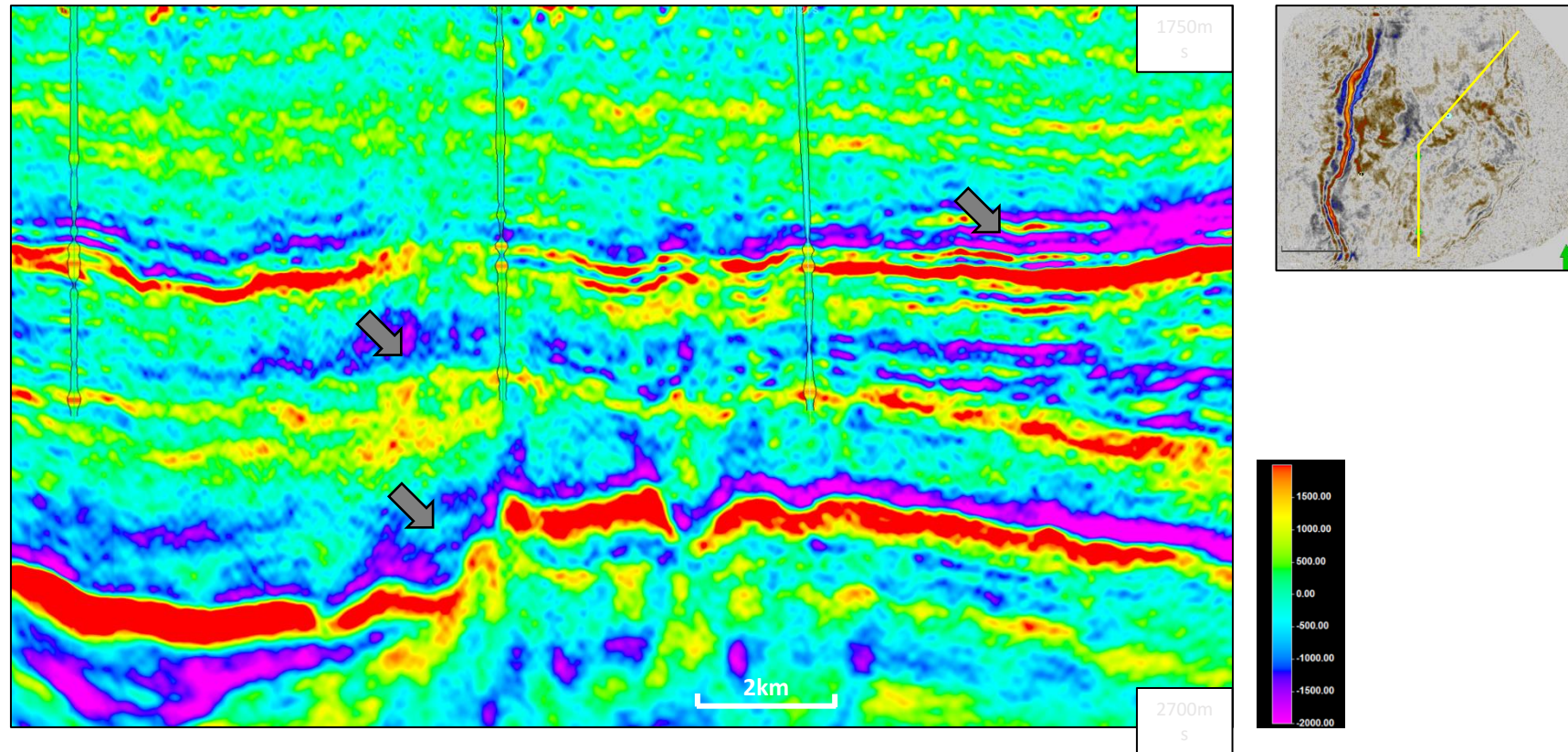


RMS amplitude map



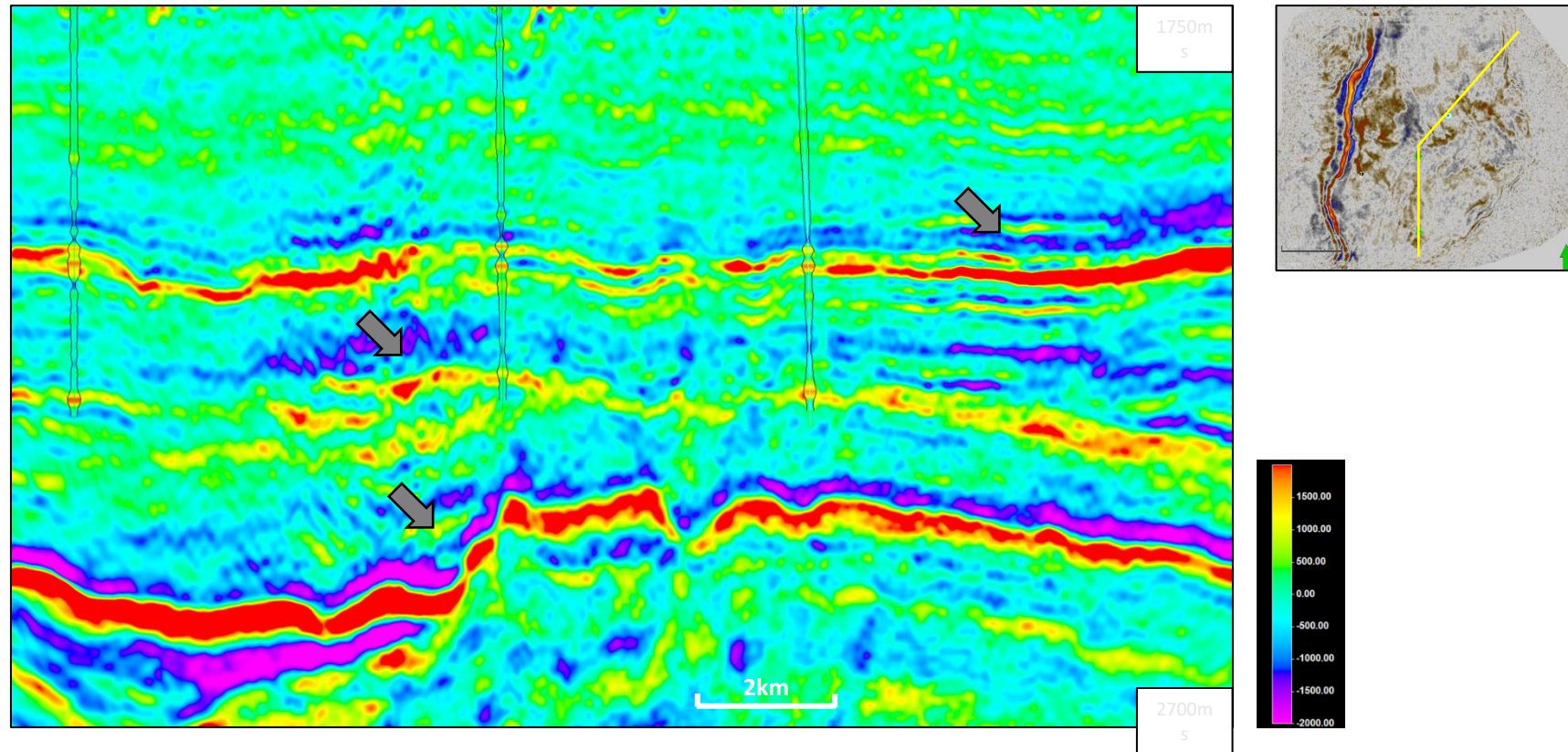
REF: Leone, C., Osen, A., Cavalca, M., Fletcher, R.P. and Ferriday, M. 2018a. Improving Quantitative Interpretation beneath Sand Injectites: A North Sea Case Study. 80<sup>th</sup> EAGE Conference & Exhibition, Extended Abstracts

## Example 3 | Relative AI: time-domain inversion



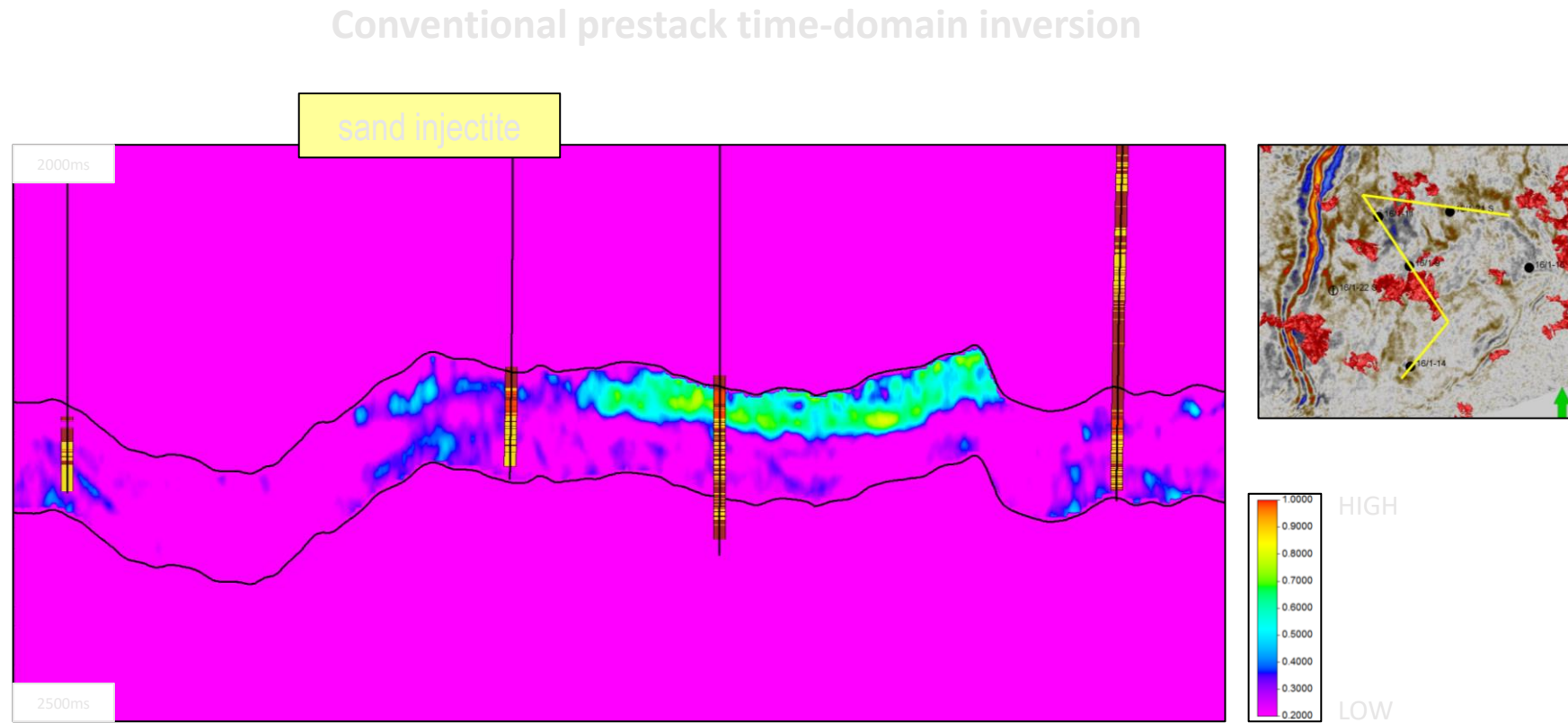
REF: Leone, C., Osen, A., Cavalca, M., Fletcher, R.P. and Ferriday, M. 2018a. Improving Quantitative Interpretation beneath Sand Injectites: A North Sea Case Study. 80<sup>th</sup> EAGE Conference & Exhibition, Extended Abstracts

## Example 3 | Relative AI: DDI



**REF:** Leone, C., Osen, A., Cavalca, M., Fletcher, R.P. and Ferriday, M. 2018a. Improving Quantitative Interpretation beneath Sand Injectites: A North Sea Case Study. 80<sup>th</sup> EAGE Conference & Exhibition, Extended Abstracts

# Example 3 | hydrocarbon sand probability



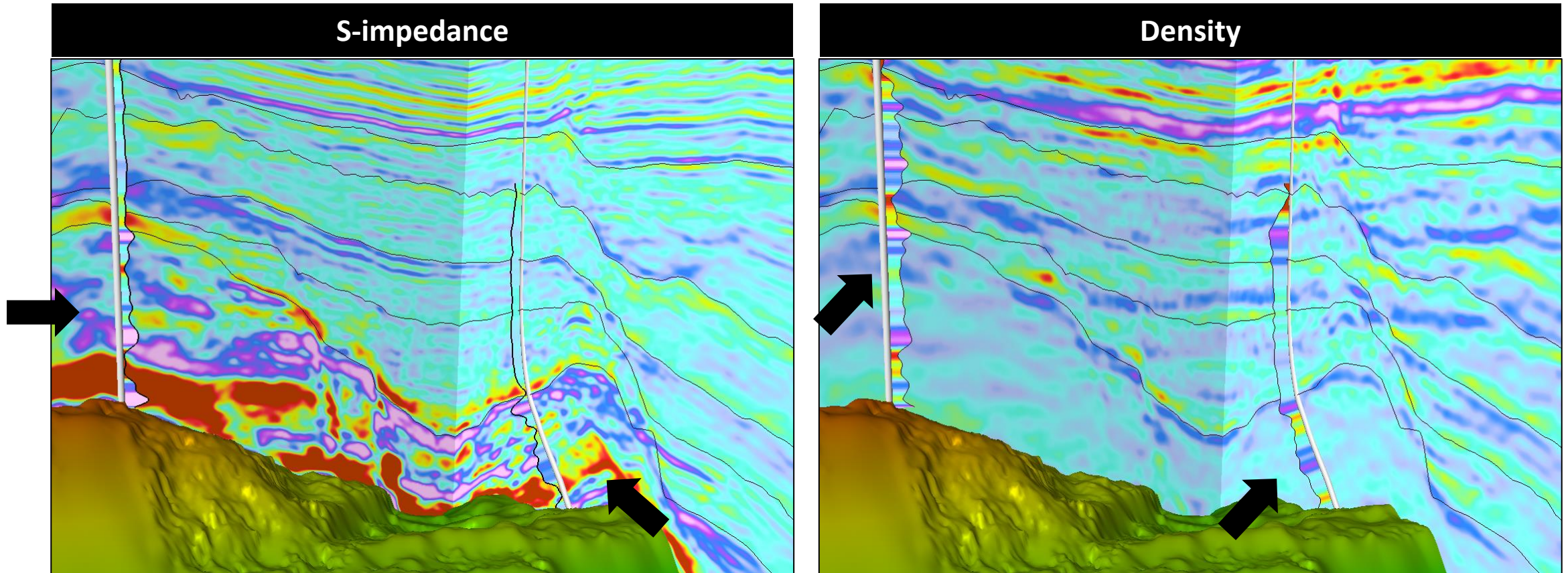
REF: Leone, C., Osen, A., Cavalca, M., Fletcher, R.P. and Ferriday, M. 2018a. Improving Quantitative Interpretation beneath Sand Injectites: A North Sea Case Study. 80<sup>th</sup> EAGE Conference & Exhibition, Extended Abstracts

# Multi-component Seismic Inversion

# Outline

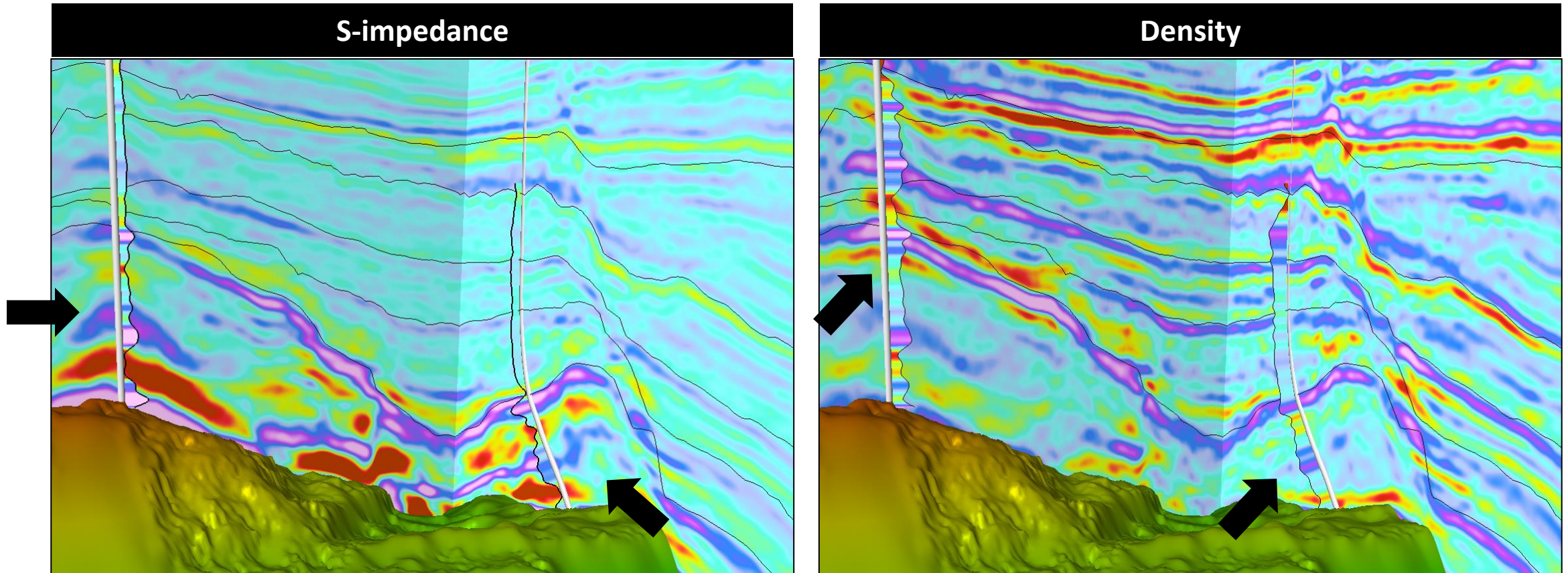
- **PP-PS inversion | Key updates**
  - Non-Linear inversion
  - Litho-elastic
    - Sequential filtering
    - Anisotropy
  - Iterative PP-PS event matching

# Case study | PP AVO Inversion



**Converted wave AVO QC and joint PP-PS density inversion at Clair Ridge**  
Bullock, A.D., Aviles, J., Leone, C., and Butt, J. (2019) 81st EAGE Conference and Exhibition

# Case study | Joint PP-PS AVO Inversion

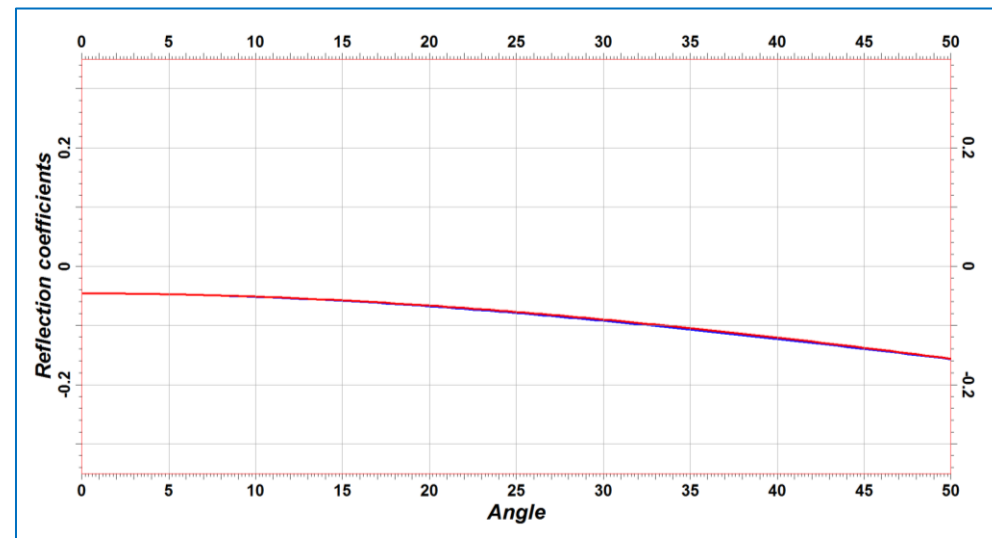


**Converted wave AVO QC and joint PP-PS density inversion at Clair Ridge**  
Bullock, A.D., Aviles, J., Leone, C., and Butt, J. (2019) 81st EAGE Conference and Exhibition

# Why non-linear AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**

	Vp	Vs	den	$\varepsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	2600	1800	2	0	0	0

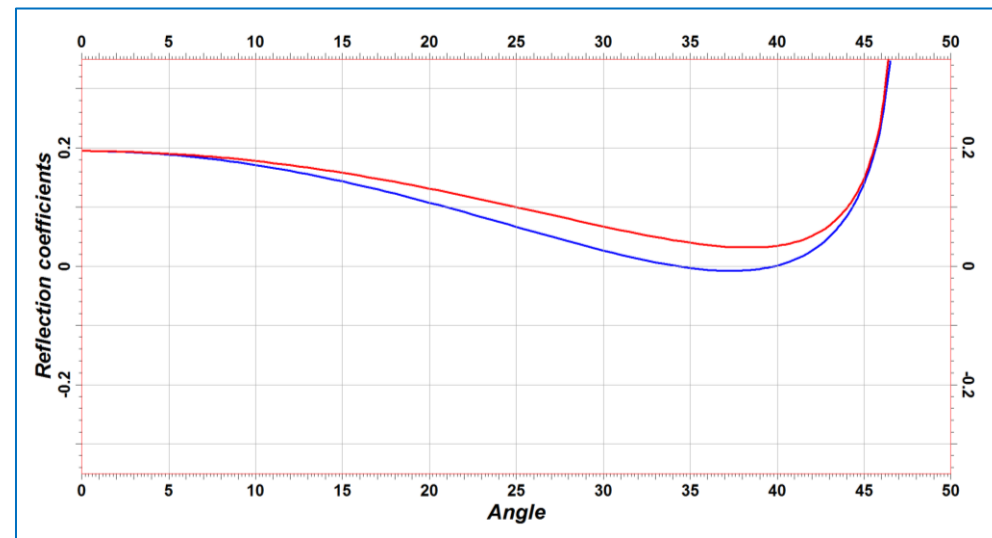


- Linear
- Non-Linear

# Why non-linear AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**

	Vp	Vs	den	$\varepsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	3600	2400	2.35	0	0	0

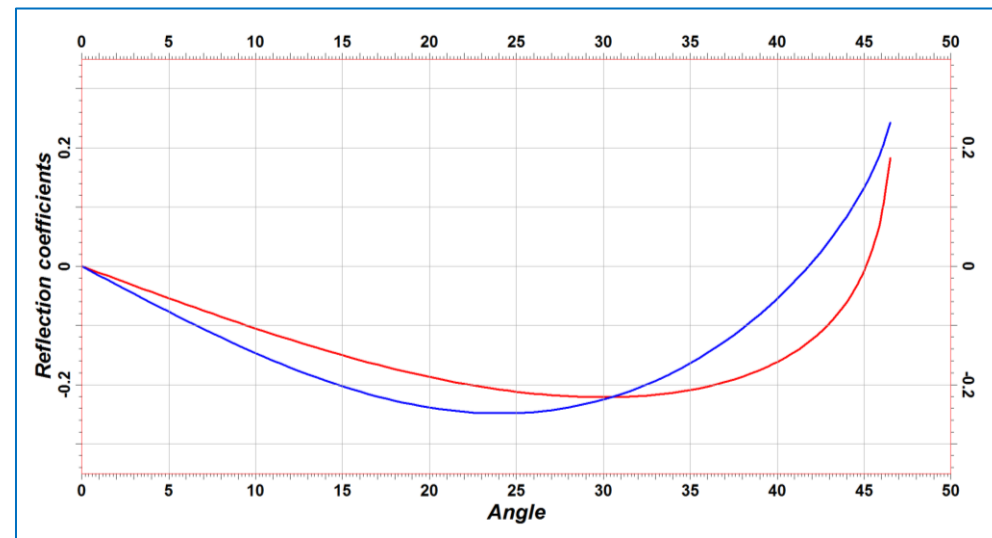


- Linear
- Non-Linear

# Why non-linear AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**
- This is even more important for **PS data**

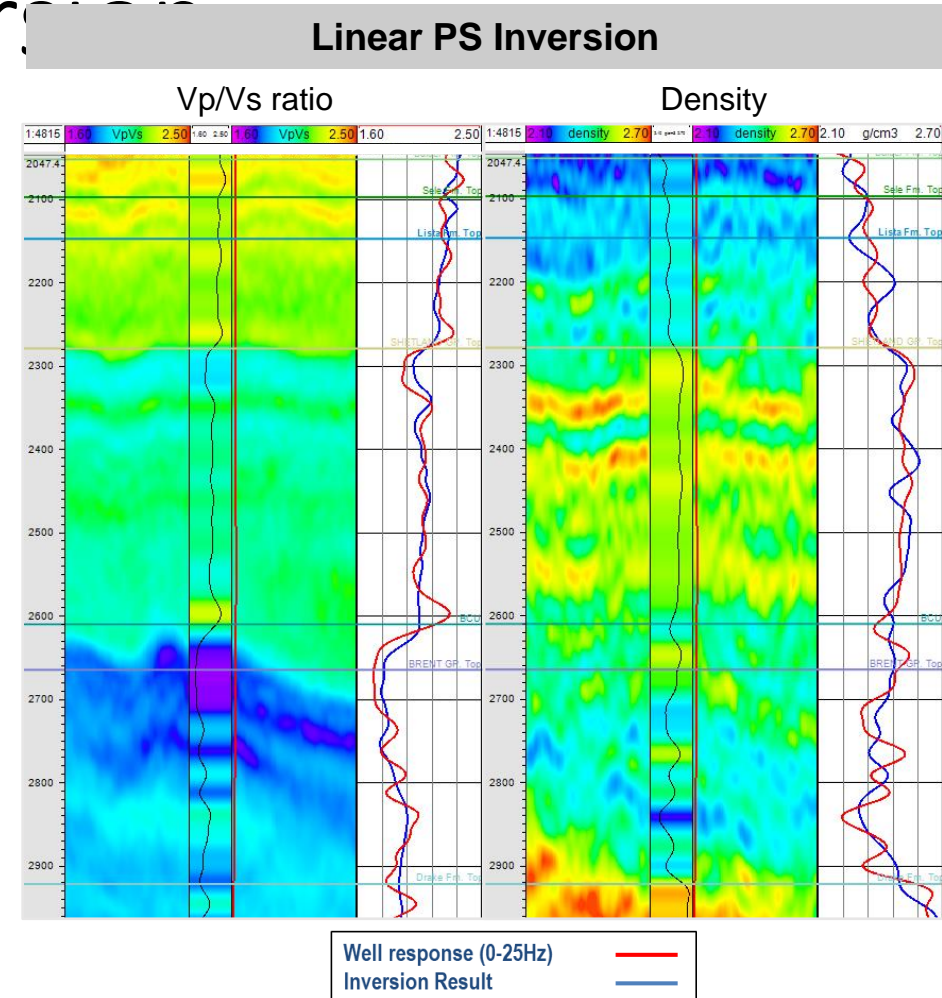
	Vp	Vs	den	$\varepsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	3600	2400	2.35	0	0	0



- Linear
- Non-Linear

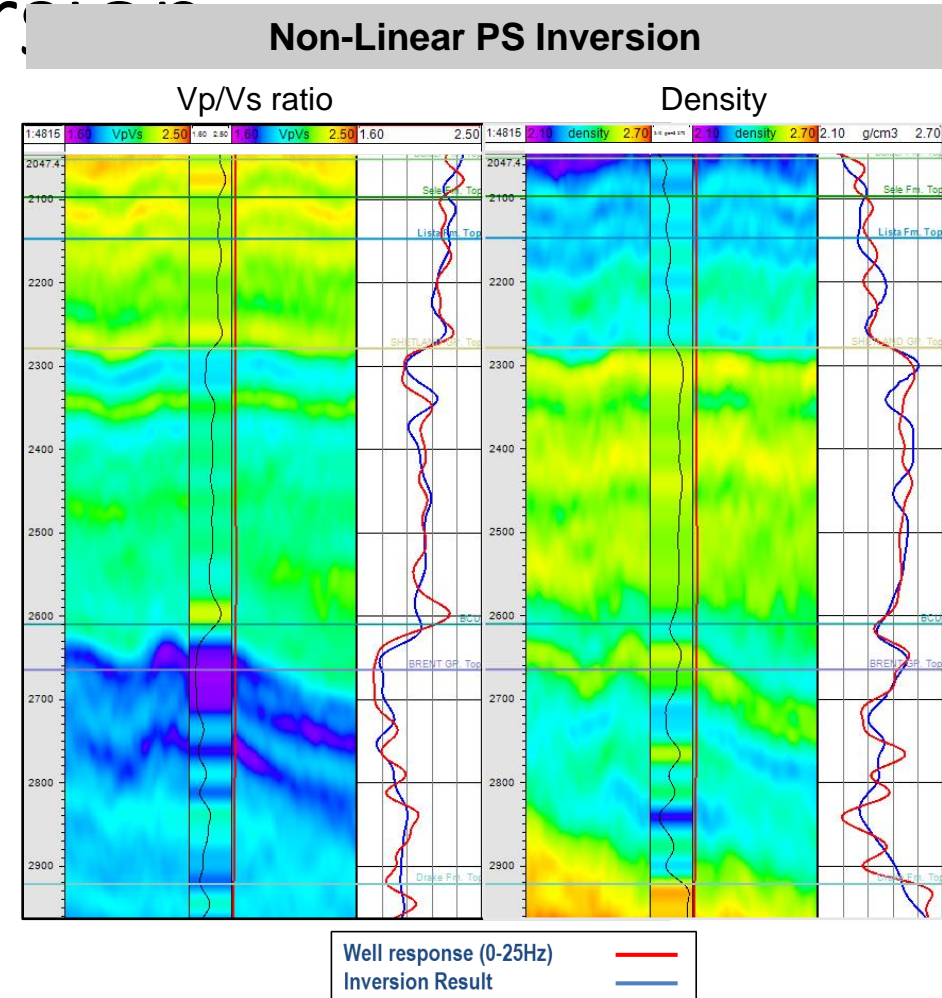
# Why non-linear AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**
- This is even more important for **PS data**



# Why non-linear AVO inversion

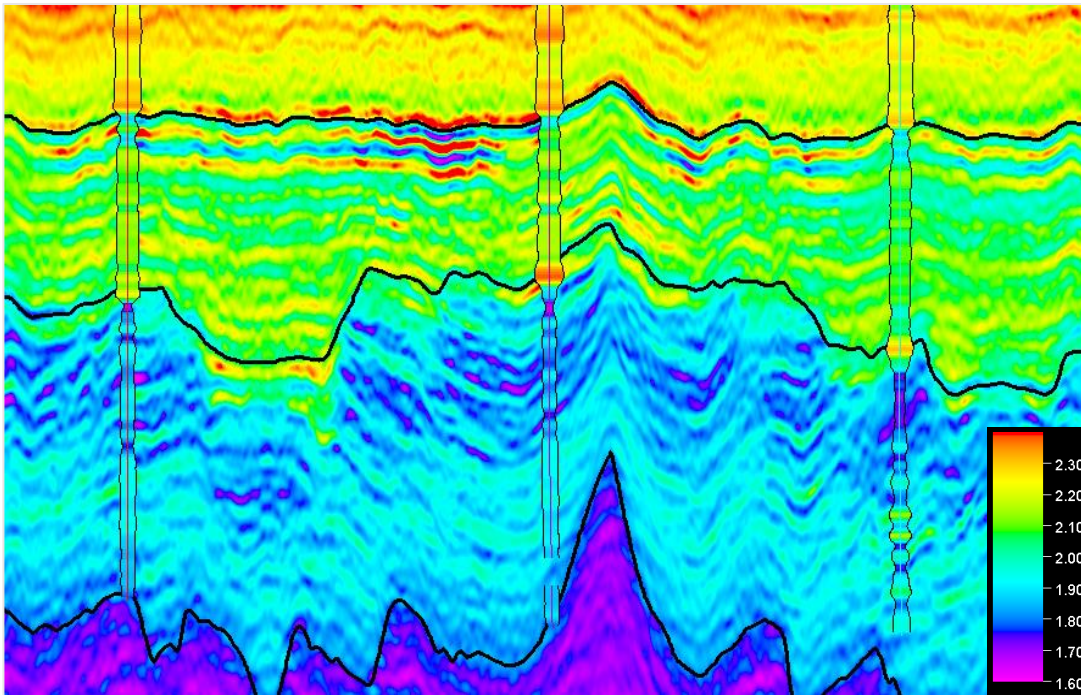
- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**
- This is even more important for **PS data**



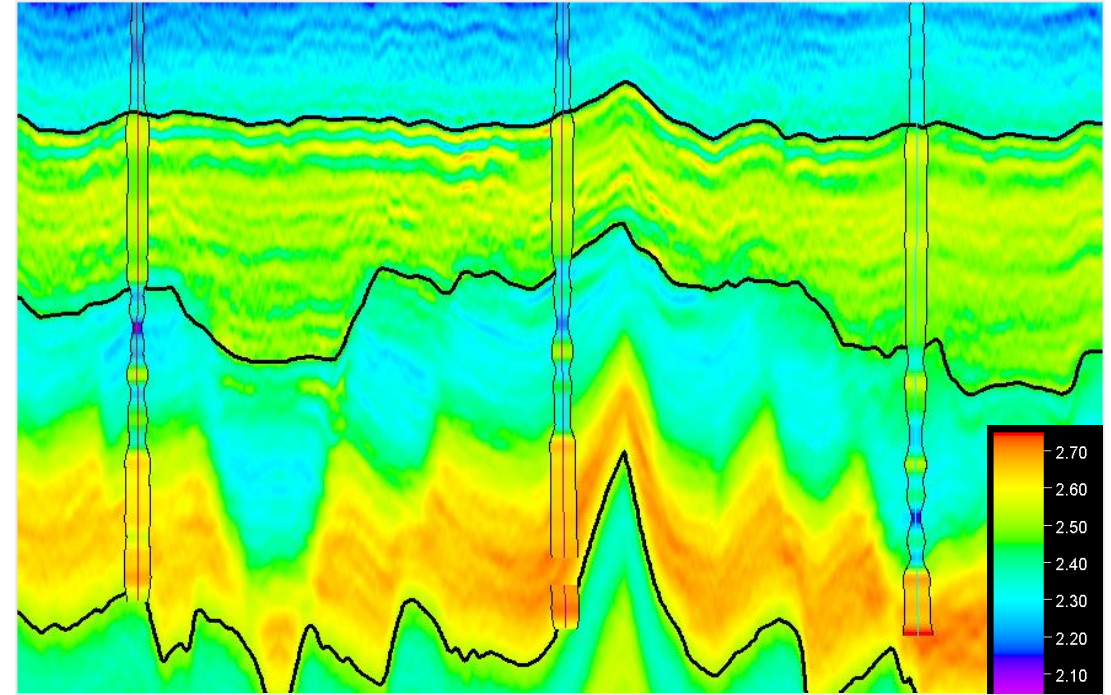
# Norway example | PP-PS Inversion

## PP AVO Inversion

Vp/Vs ratio



Density



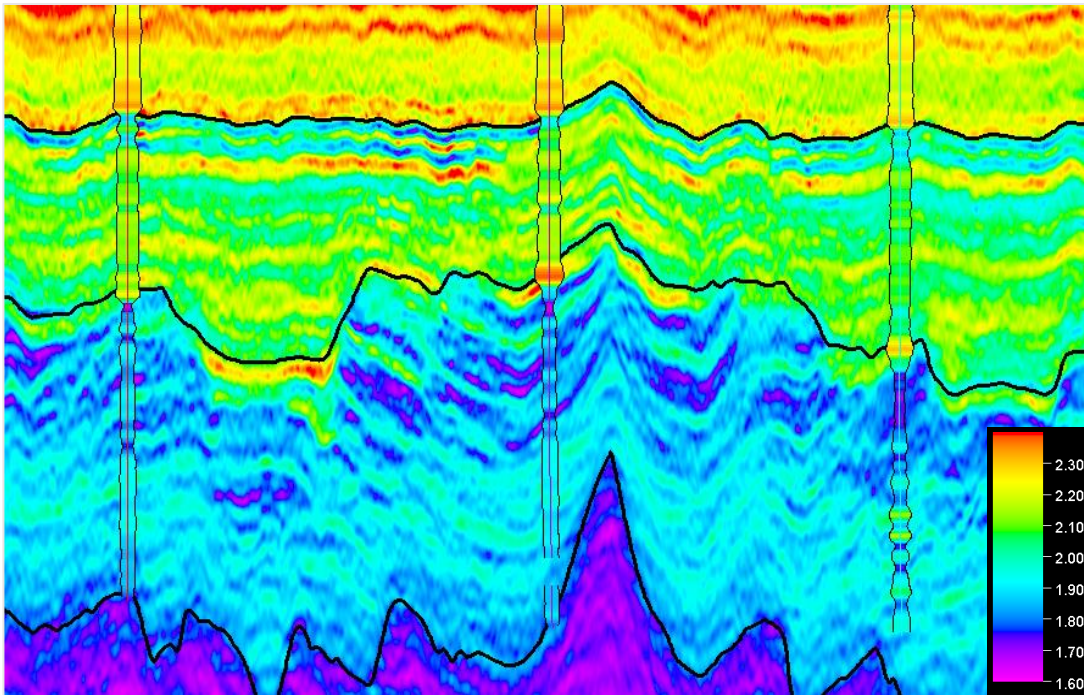
**The value of PS seismic and non-linear inversion for reservoir characterization: Oseberg South case study**

Thomas Barling\*, James Butt, Maria Shadrina and Claudio Leone, Schlumberger; Hugo Sese, Equinor

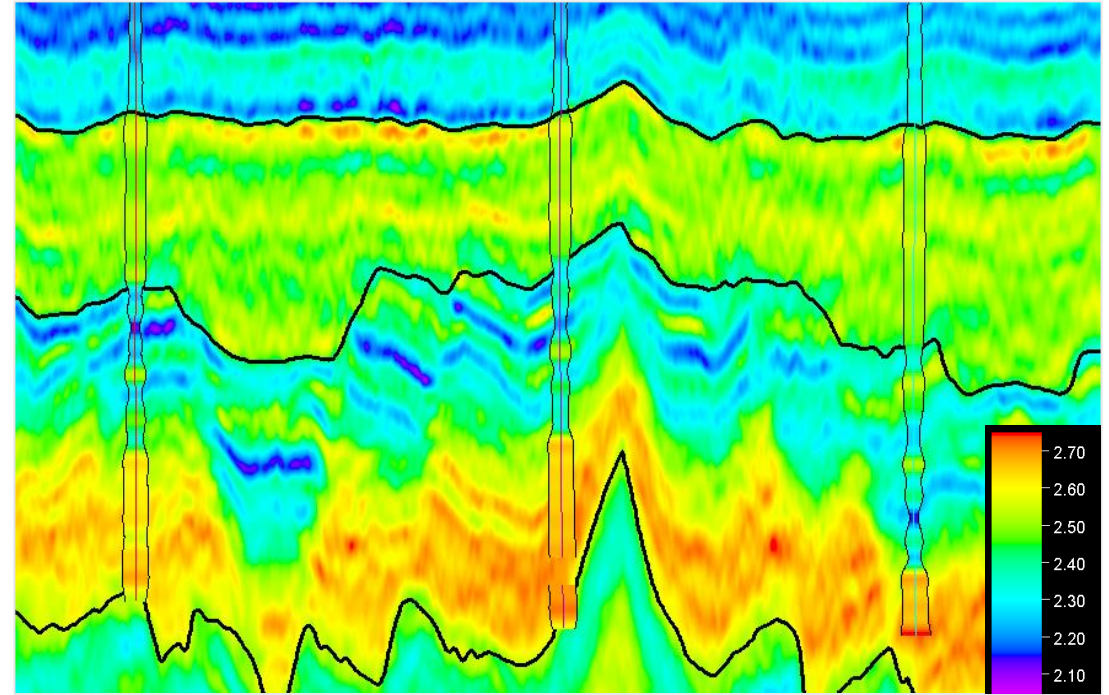
# Norway example | PP-PS Inversion

## PP-PS AVO Inversion

Vp/Vs ratio



Density



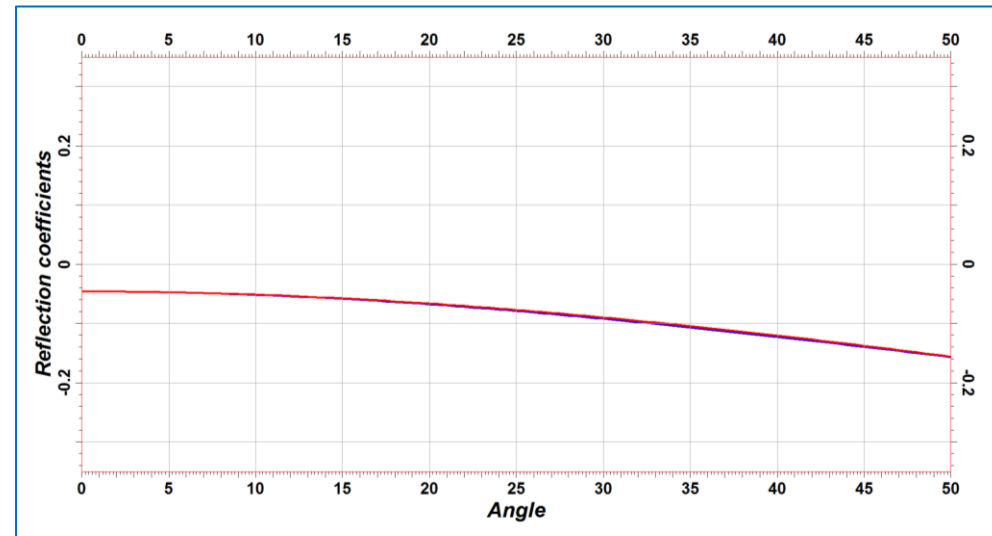
**The value of PS seismic and non-linear inversion for reservoir characterization: Oseberg South case study**

Thomas Barling\*, James Butt, Maria Shadrina and Claudio Leone, Schlumberger; Hugo Sese, Equinor

# Why anisotropic AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**

	Vp	Vs	den	$\epsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0	0	0
Layer 2	2600	1800	2	0	0	0



- Linear
- Non-Linear

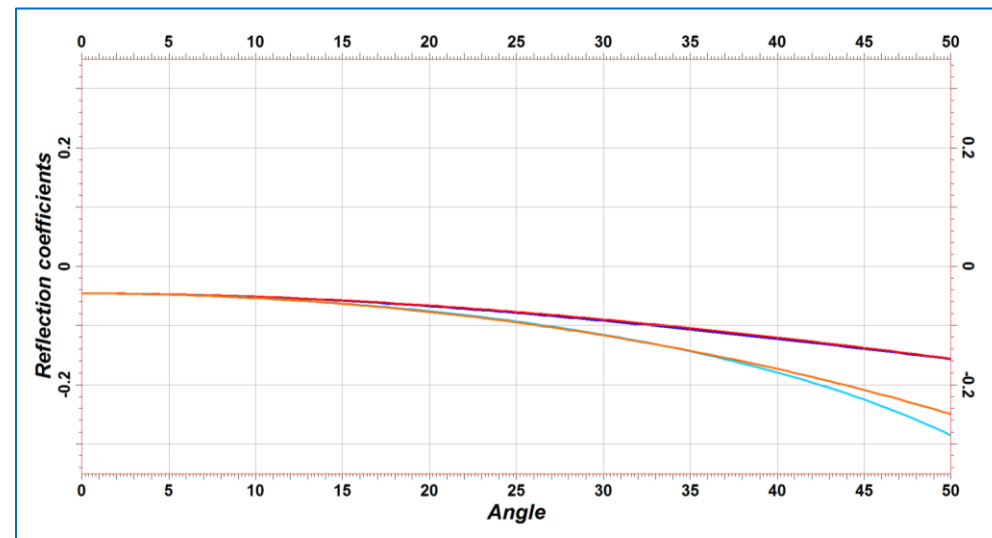
## Non-linear orthorhombic AVAZ inversion workflow

E.Gofer, R.Bachrach, R.Fletcher, M.Vie - 86th SEG International Annual Meeting, 2016

# Why anisotropic AVO inversion

- Linearized AVO approximations assume:
  - small contrasts
  - narrow reflection angles (<30deg)and are not valid in presence of **strong contrasts**
- Similarly, AVO is affected by contrasts in **anisotropy**, related to:
  - shales (VTI)
  - Fractured or stressed media (HTI, VFTI, ORT)

	Vp	Vs	den	$\epsilon$	$\delta$	$\gamma$
Layer 1	2625	1548	2.173	0.24	0.12	0.24
Layer 2	2600	1800	2	0	0	0



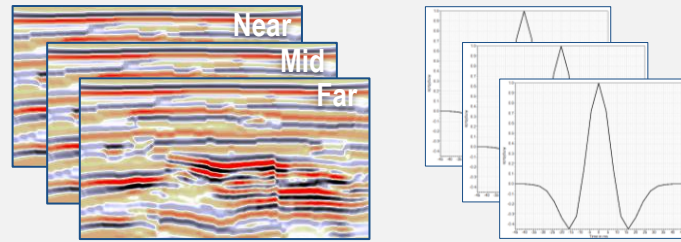
- Linear
- Non-Linear
- VTI Linear
- VTI Non-Linear

## Non-linear orthorhombic AVAZ inversion workflow

E.Gofer, R.Bachrach, R.Fletcher, M.Vie - 86th SEG International Annual Meeting, 2016

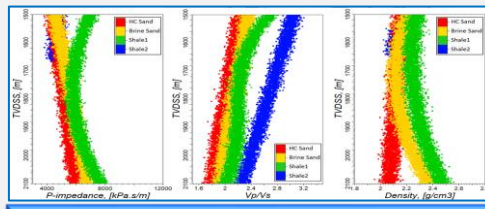
# LPE Inversion

## Seismic Angle Stacks + Wavelets



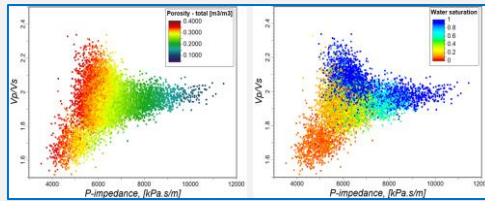
## Rock Physics

Litho-classes  
and trends  
definition



Lithology PDF (*Litho-brain*)

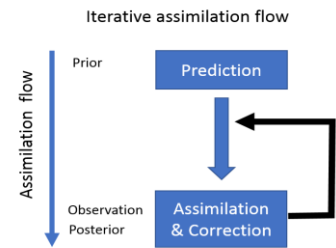
Stochastic  
Rock Physics  
modelling



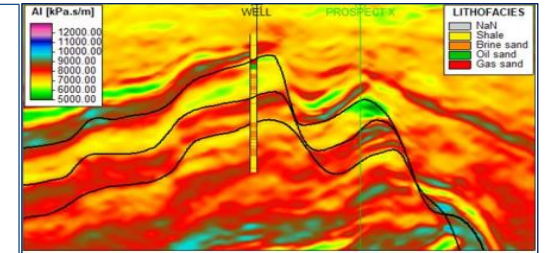
Rock Model PDF (*Petro-brain*)

## LPE Inversion

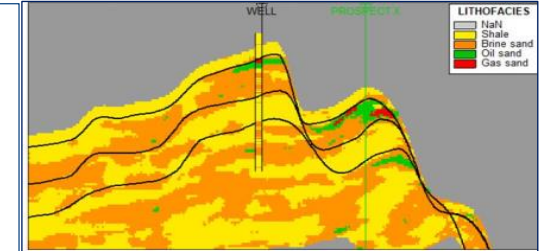
Non-Linear, Anisotropic inversion engine



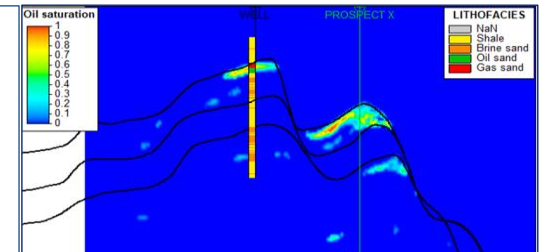
Elastic  
Properties



Lithology



Petrophysical  
Properties

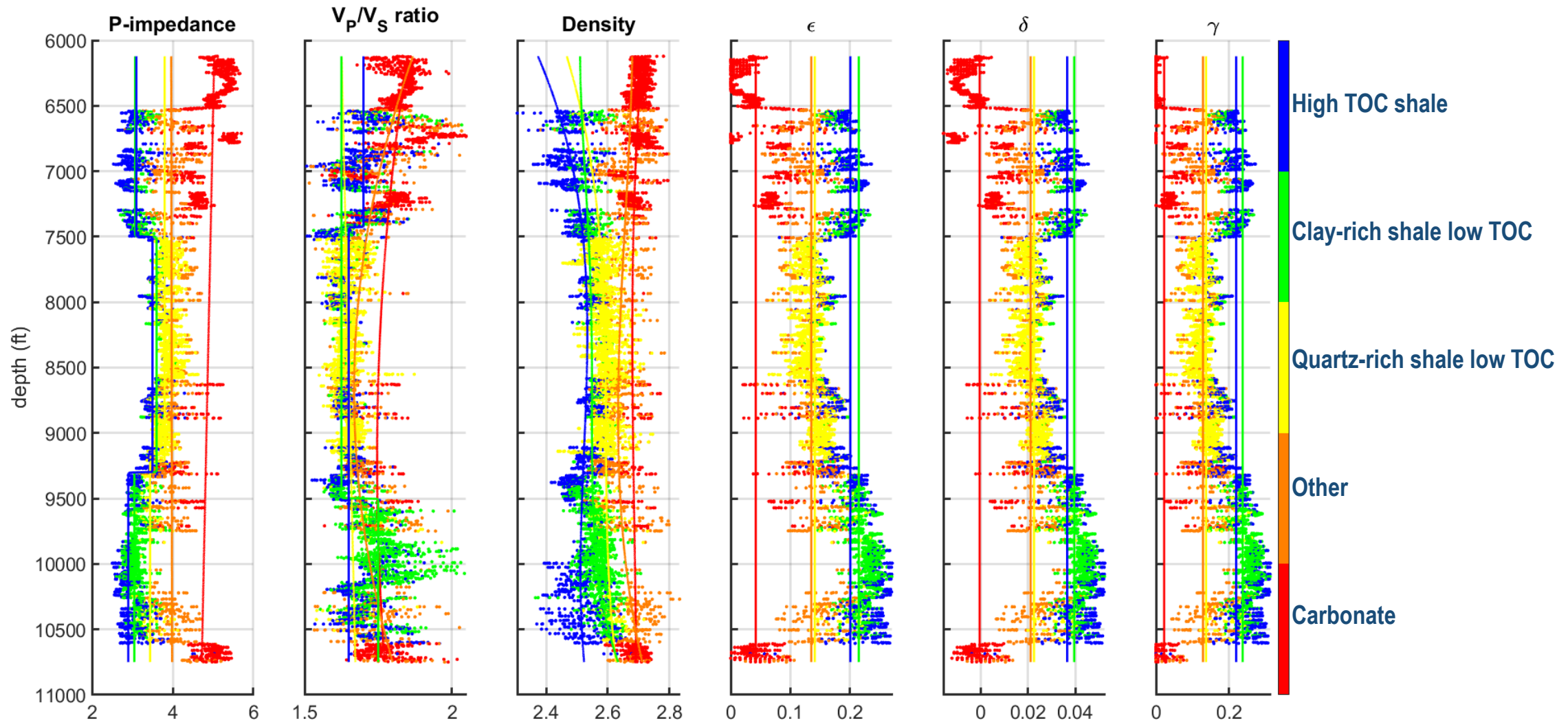


Nonlinear Single Loop Litho-Petro-Elastic Prestack Inversion Using Data Assimilation Techniques

R. Bachrach (2018) 80th EAGE Conference and Exhibition

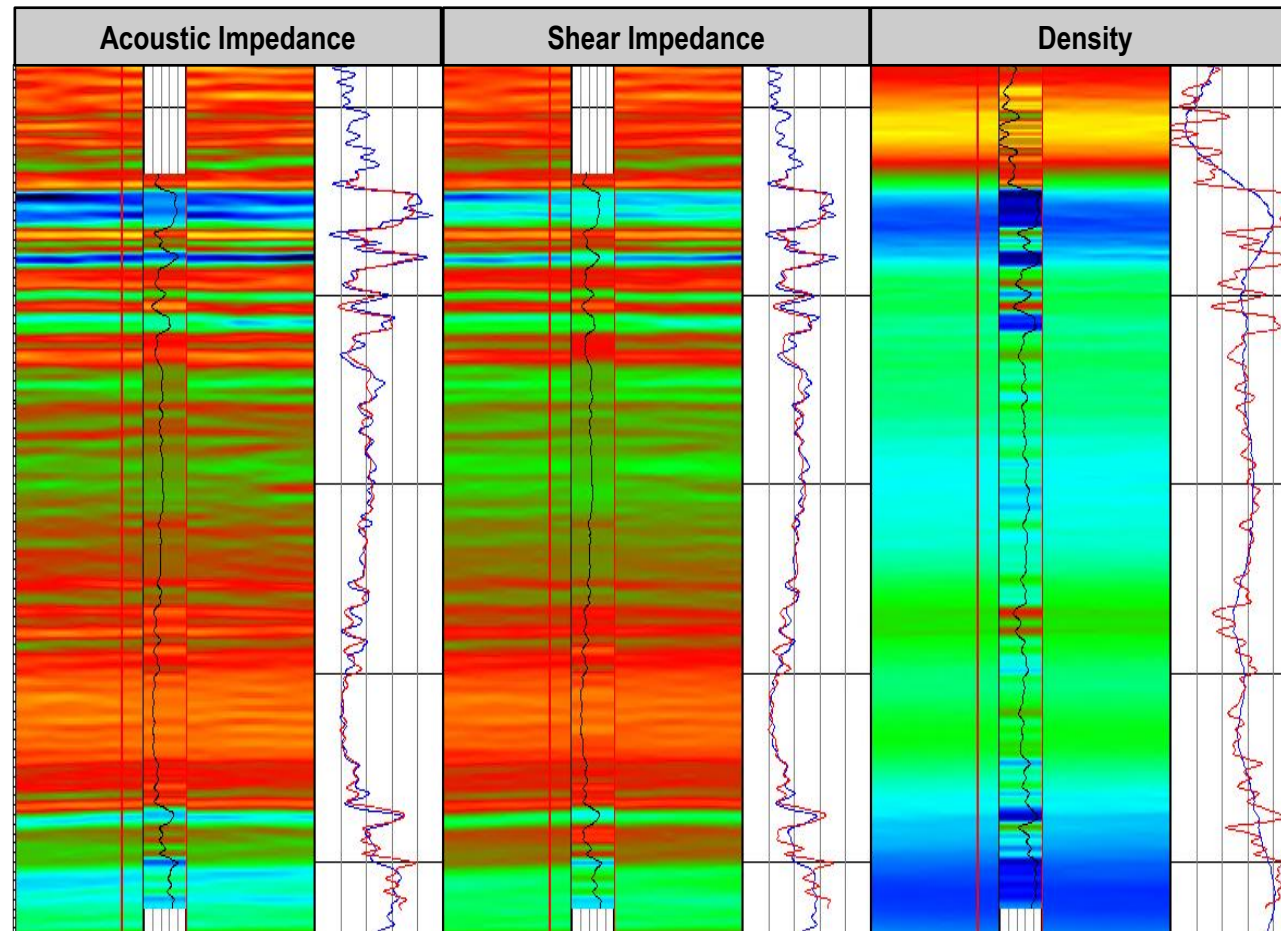
# PP-PS case study | VTI Trends

*Note: Transverse isotropy parameter values estimated using Leaney and Jocker (2018) tensor completion approach*



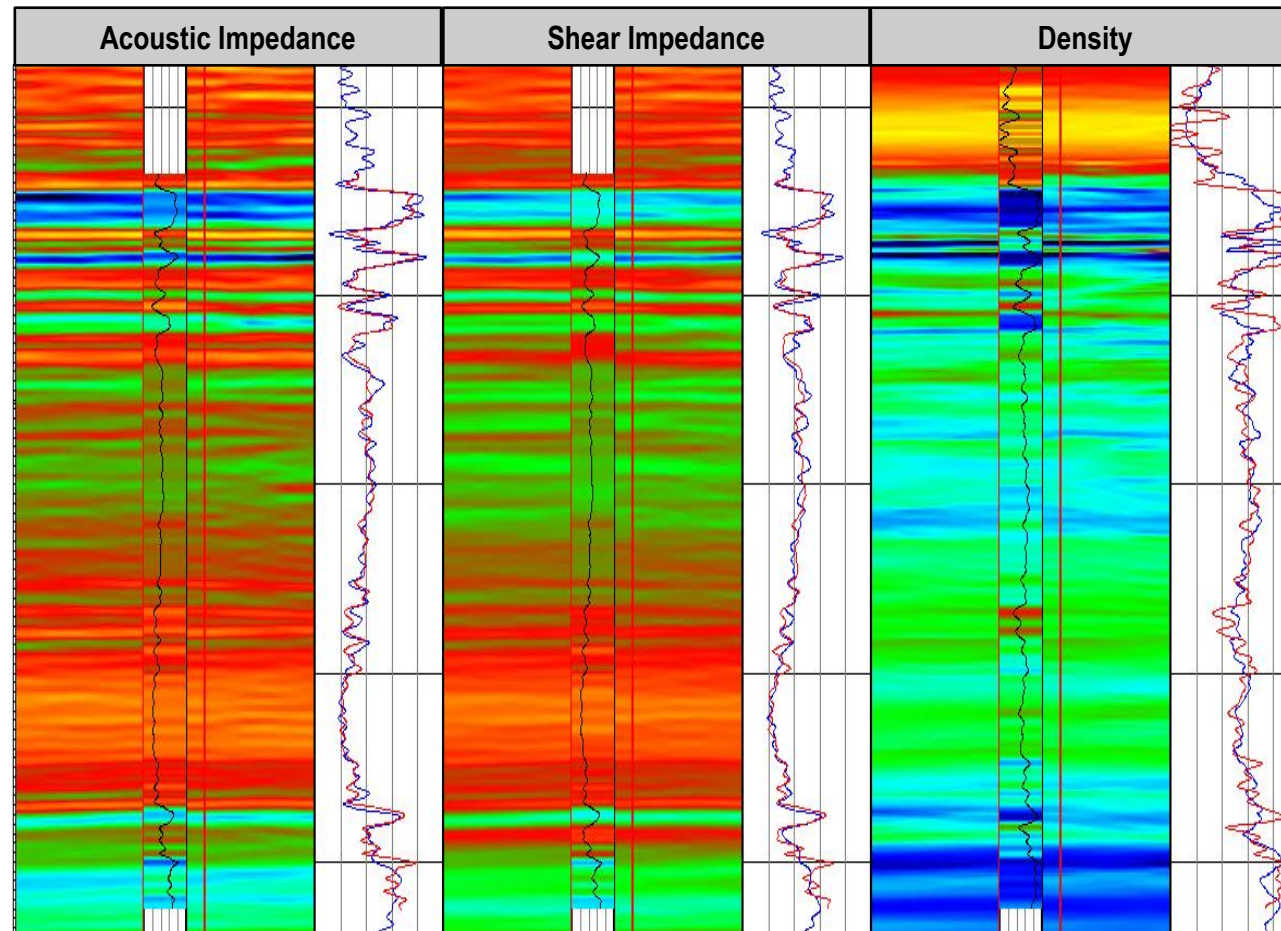
REF: Bachrach, R., Gofer, E., Nonlinear Anisotropic Joint Pp-Ps Litho-Elastic Inversion: Example from Midland Basin (2019)

# PP-PS case study | PP AVO Inversion



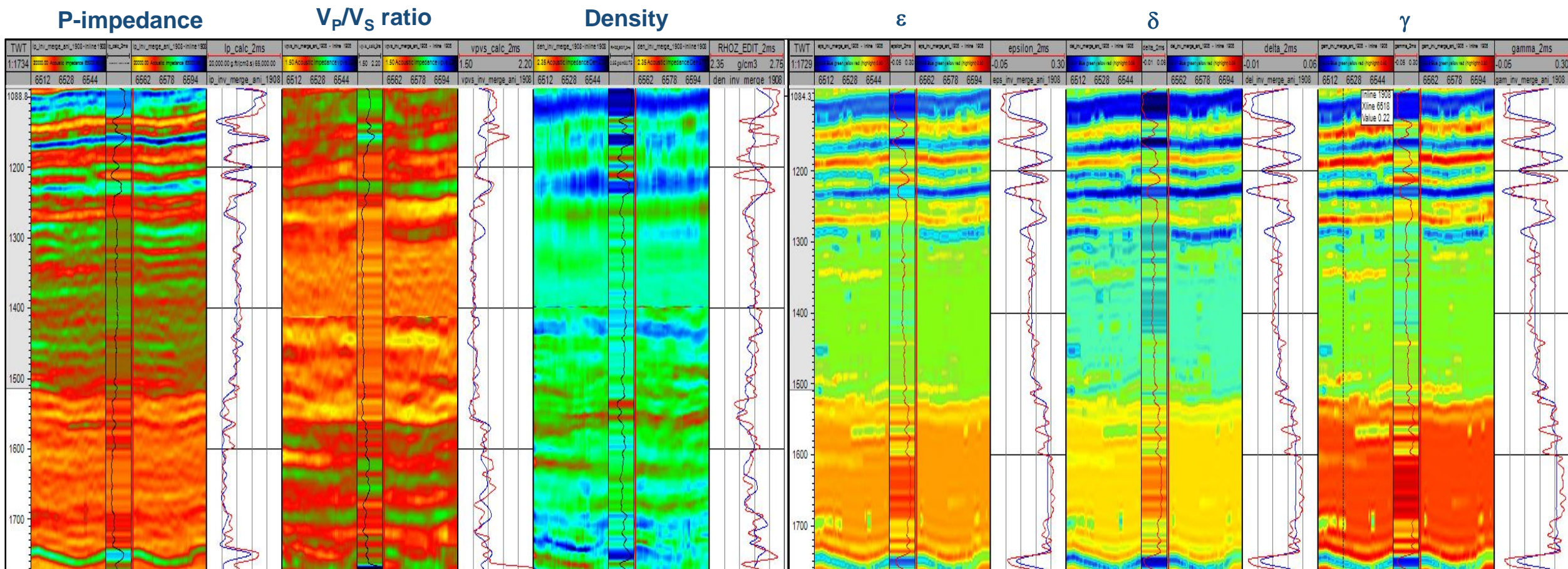
**Joint PP-PS litho-elastic AVO inversion: Example from Midland Basin**  
Gofer, E, Bachrach, R., Golfre Andreasi, F., Re, S. (2019) SEG Annual Meeting

# PP-PS case study | PP-PS AVO Inversion

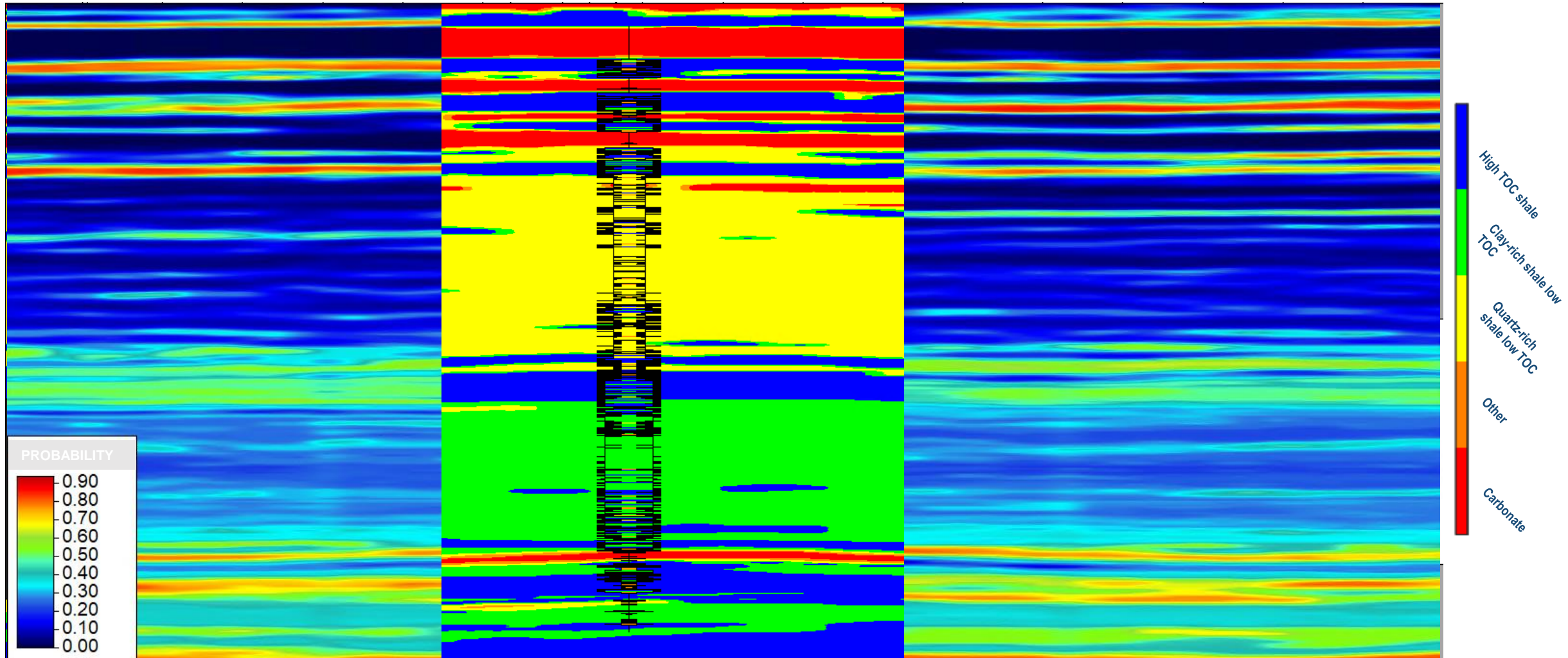


**Joint PP-PS litho-elastic AVO inversion: Example from Midland Basin**  
Gofer, E, Bachrach, R., Golfre Andreasi, F., Re, S. (2019) SEG Annual Meeting

# PP-PS case study | PP-PS AVO inversion

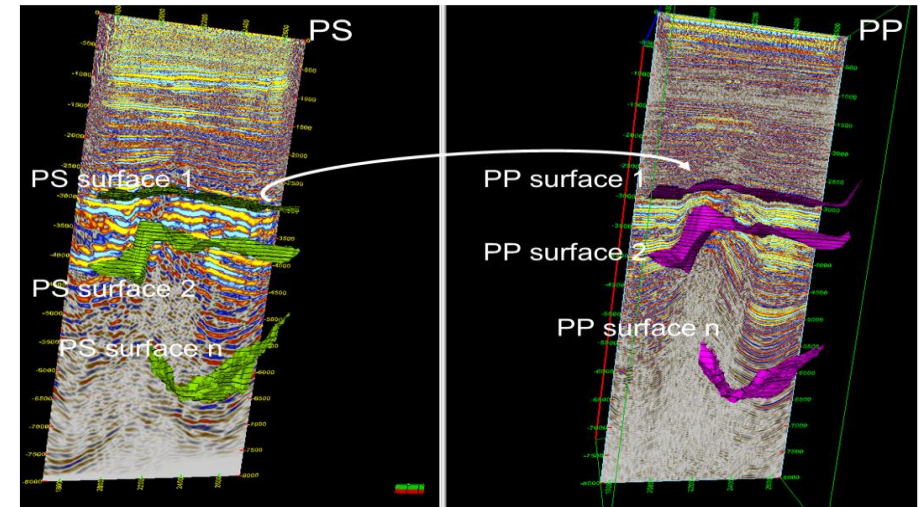


# Estimated Litho-Class and Probability of High TOC Shale



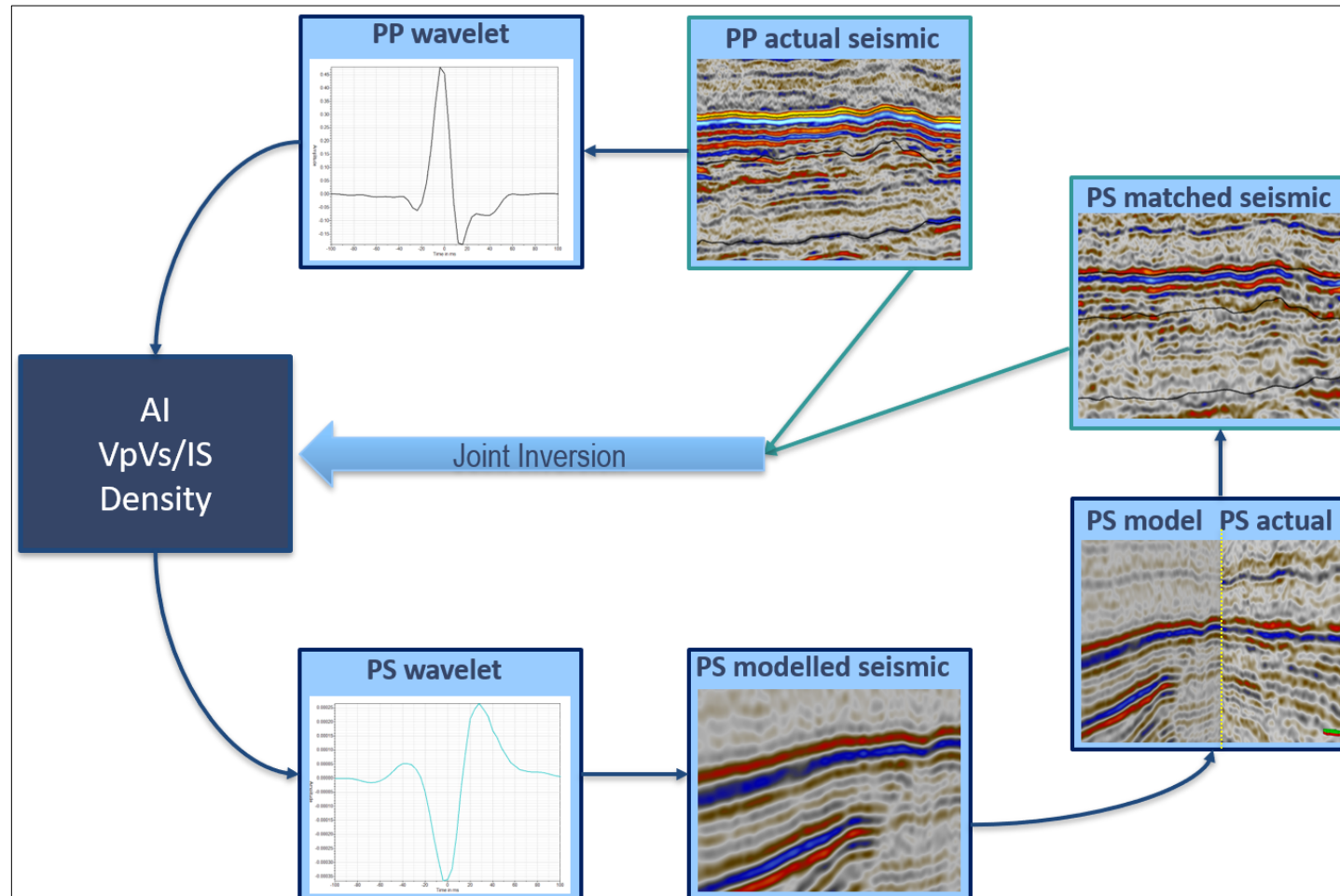
# PP-PS event matching

- **For model building:**
  - Create displacement fields for Joint PP-PS Tomography
  - Need to handle large displacements
  - Manual, semi-automated and automated methods
  - Dynamic Image Warping technique with Vel update QC
- **For inversion:**
  - Residual alignment prior to inversion (small displacements)
  - Need to handle differences in reflectivity, frequency content, phase



# PP-PS Event Matching - Workflow

Residual alignment prior to AVO inversion



# Summary

- Recent advanced in inversion technology allowed to extract more value out of PS amplitudes
- Case studies were presented where this had a key impact on the understanding of the reservoir

# References

- Barling, T., Butt, J., Shadrina, M., Paxton, A., Leone, C., Sese, H., Patriarca, C. (2021) **The Value of PS Seismic and Non-linear Inversion for Reservoir Characterization: Oseberg South North Sea Case Study**, SEG annual meeting 2021
- Bullock, A.D., Aviles, J., Leone, C., and Butt, J. (2019) **Converted wave AVO QC and joint PP-PS density inversion at Clair Ridge**. 81st EAGE Conference and Exhibition
- Gofer, E, Bachrach, R., Golfre Andreasi, F., Re, S. (2019) **Joint PP-PS litho-elastic AVA inversion: Example from Midland Basin**. SEG Annual Meeting
- M Paydayesh, M Leathard, J Mathewson, **The synergy between PP and PS for reservoir definition**, 76° EAGE Conference and Exhibition 2014
- A.Barnola, M.Ibram, **3D simultaneous joint PP-PS pre-stack seismic inversion at Schiehallion field, United Kingdom Continental Shelf**, Geophysical Prospecting, 2014, 62, 278–292
- A. Murineddu, A.Rasmussen, F.R. Mohamed, A.S. Wendt, M.Nickel , **PZPS Event Matching and Simultaneous Inversion - A Critical Input to 3D Mechanical Earth Modeling**, 70° EAGE Conference and Exhibition

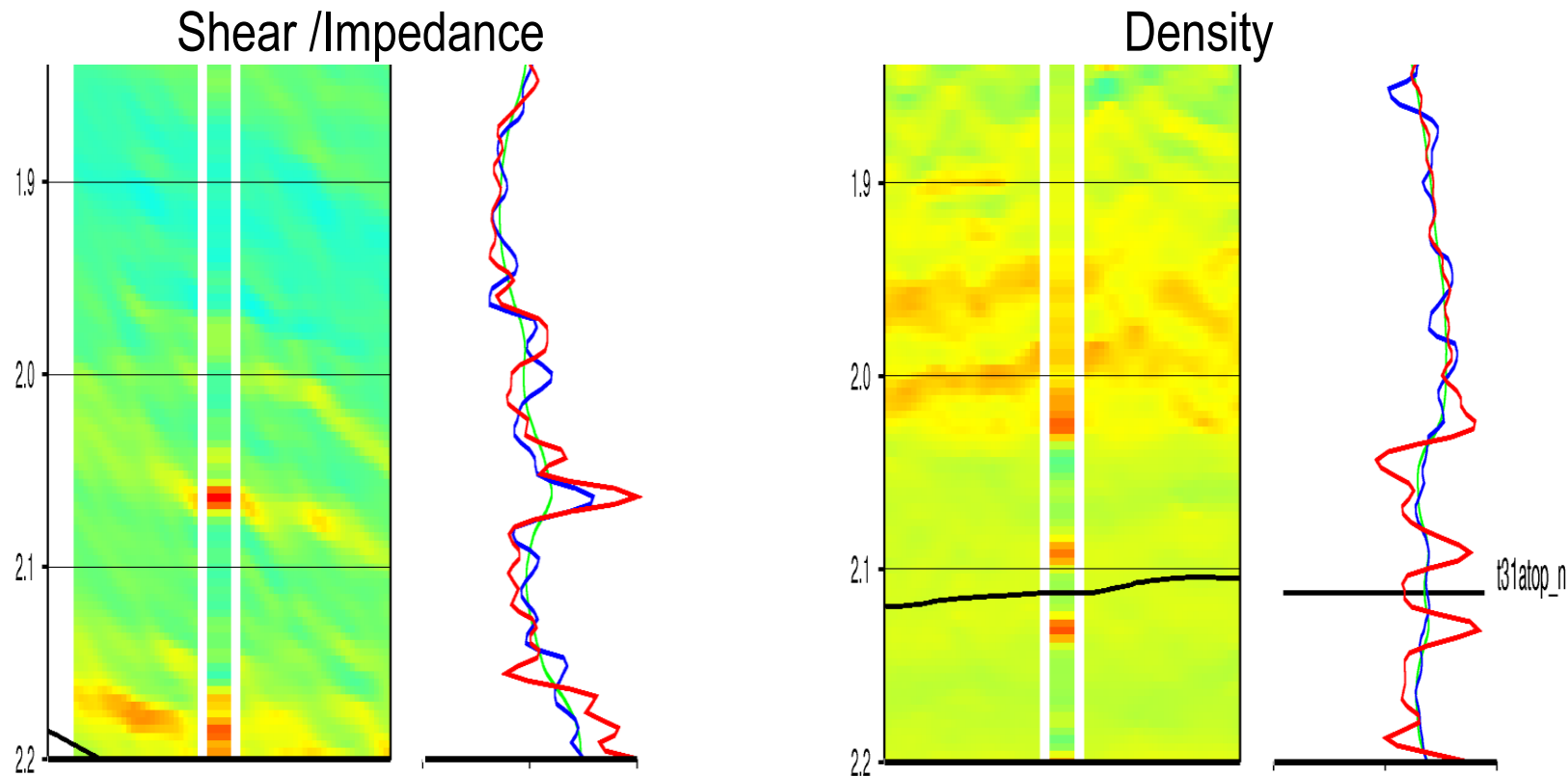
# Older case studies

# Case study: Simultaneous Joint PP-PS

Improved Shear Impedance and density estimation

## Inversion

### PP AVO Inversion



3D simultaneous joint PP-PS pre-stack seismic inversion at Schiehallion field, United Kingdom Continental Shelf

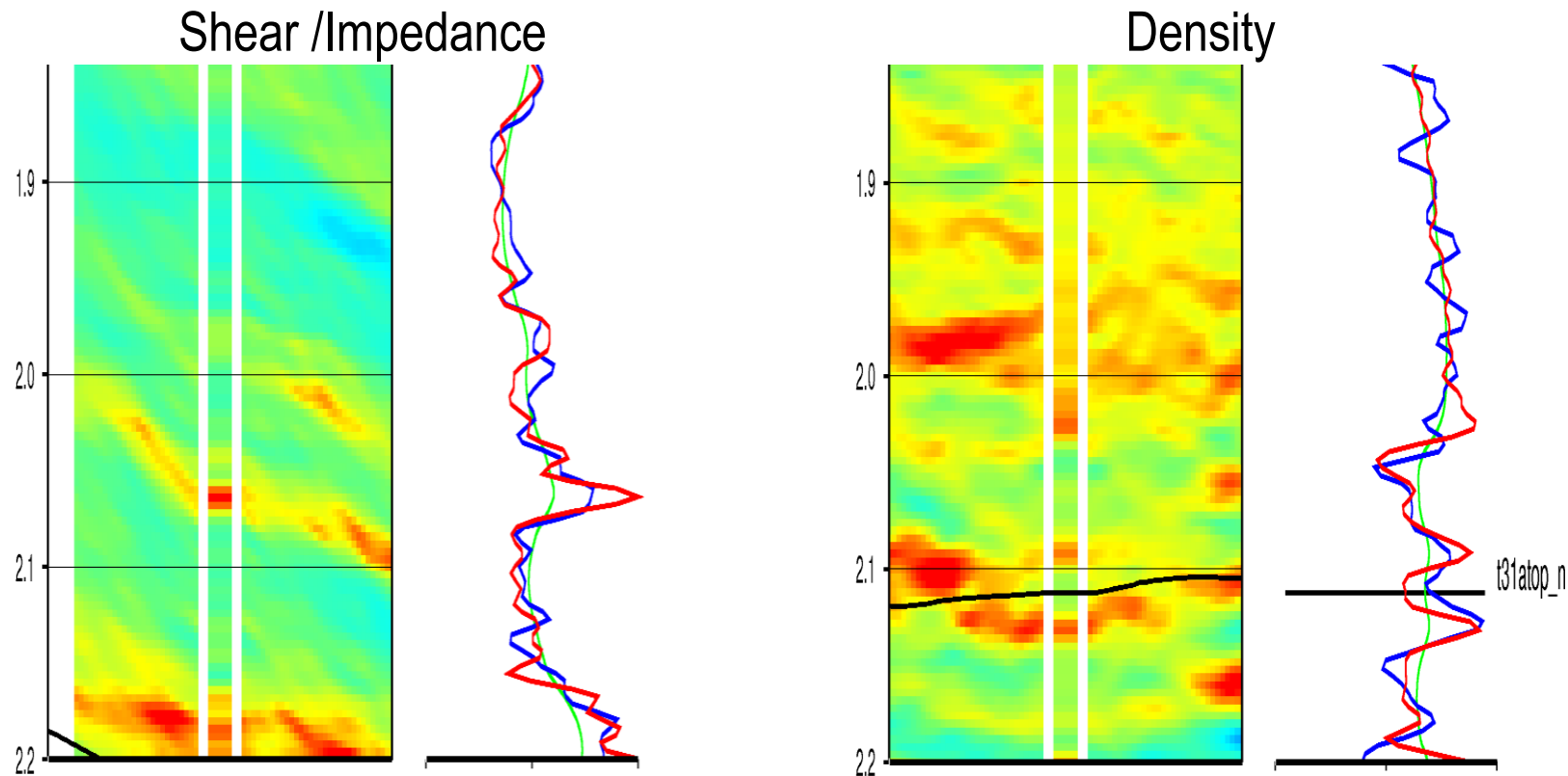
A.Barnola, M.Ibram - Geophysical Prospecting, 2014, 62, 278–292

# Case study: Simultaneous Joint PP-PS

Improved Shear Impedance and density estimation

## Inversion

### PP-PS AVO Inversion



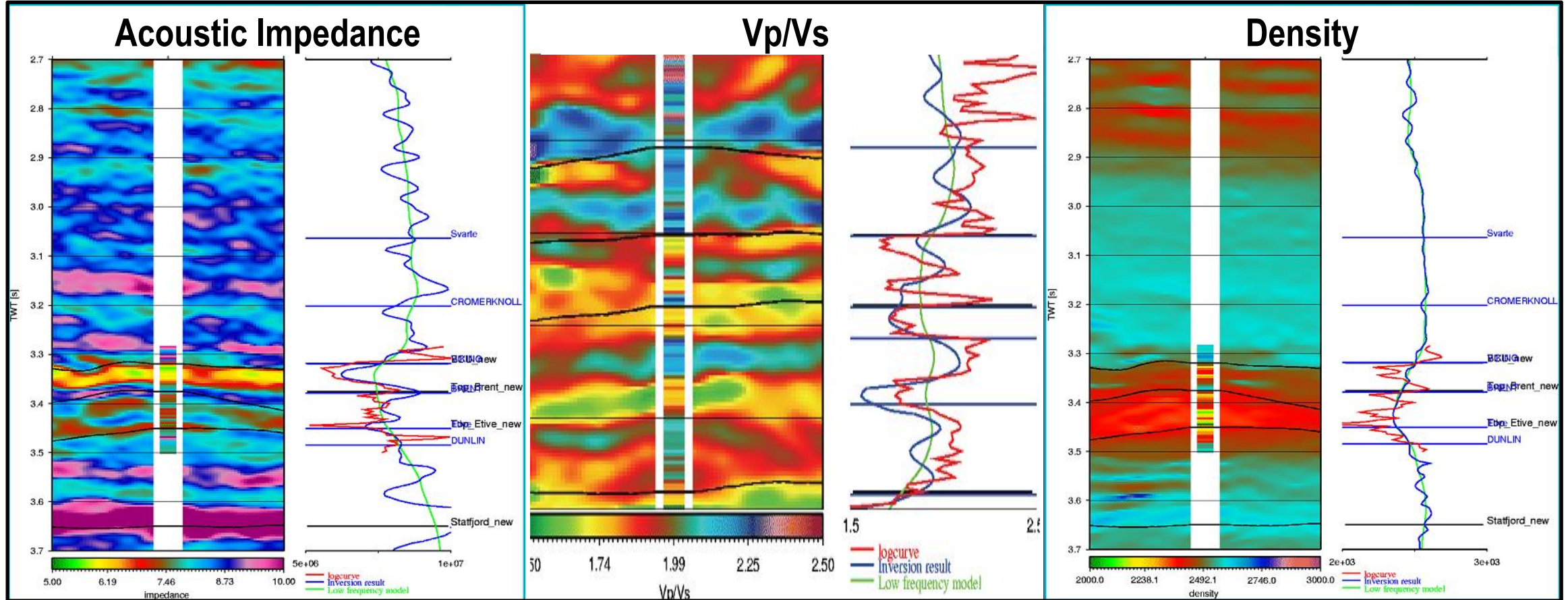
3D simultaneous joint PP-PS pre-stack seismic inversion at Schiehallion field, United Kingdom Continental Shelf

A.Barnola, M.Ibram - Geophysical Prospecting, 2014, 62, 278–292

# Case study: Simultaneous Joint PP-PS

Inversion

## PP AVO Inversion



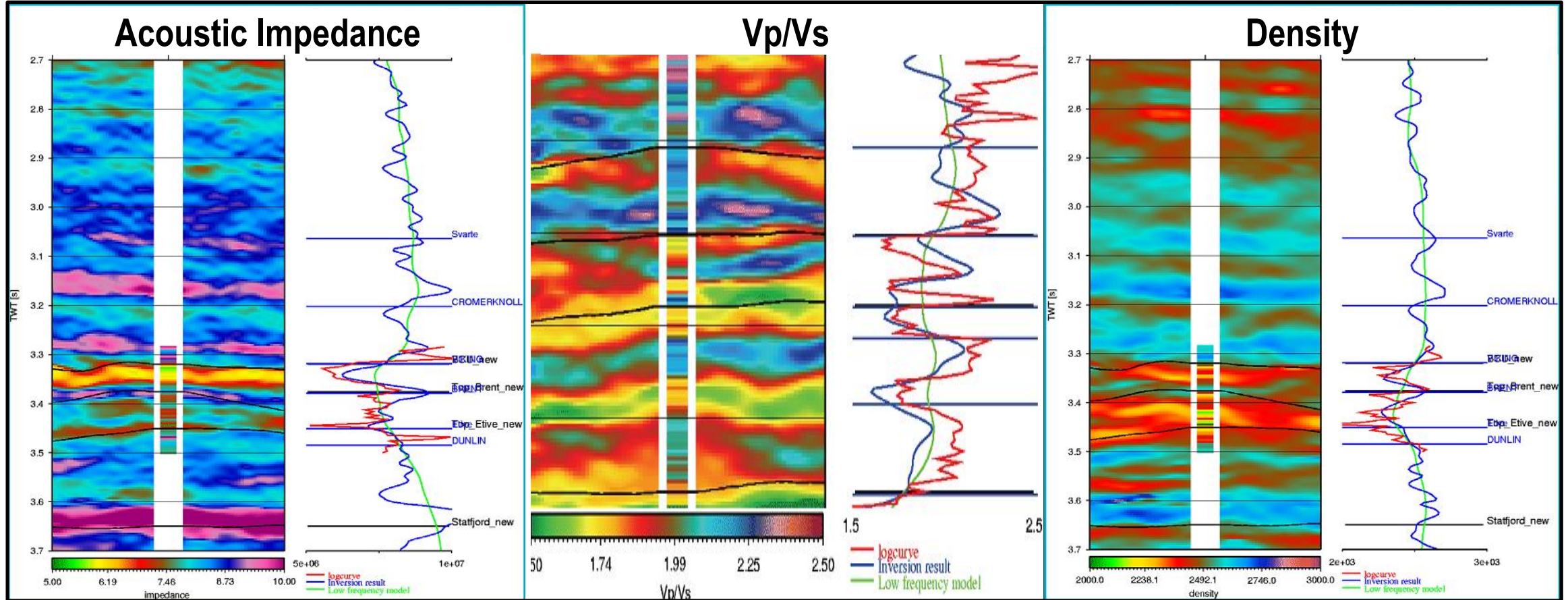
**PZPS Event Matching and Simultaneous Inversion - A Critical Input to 3D Mechanical Earth Modeling**

A. Murineddu, A.Rasmussen, F.R. Mohamed, A.S. Wendt, M.Nickel - 70° EAGE Conference and Exhibition

# Case study: Simultaneous Joint PP-PS

Inversion

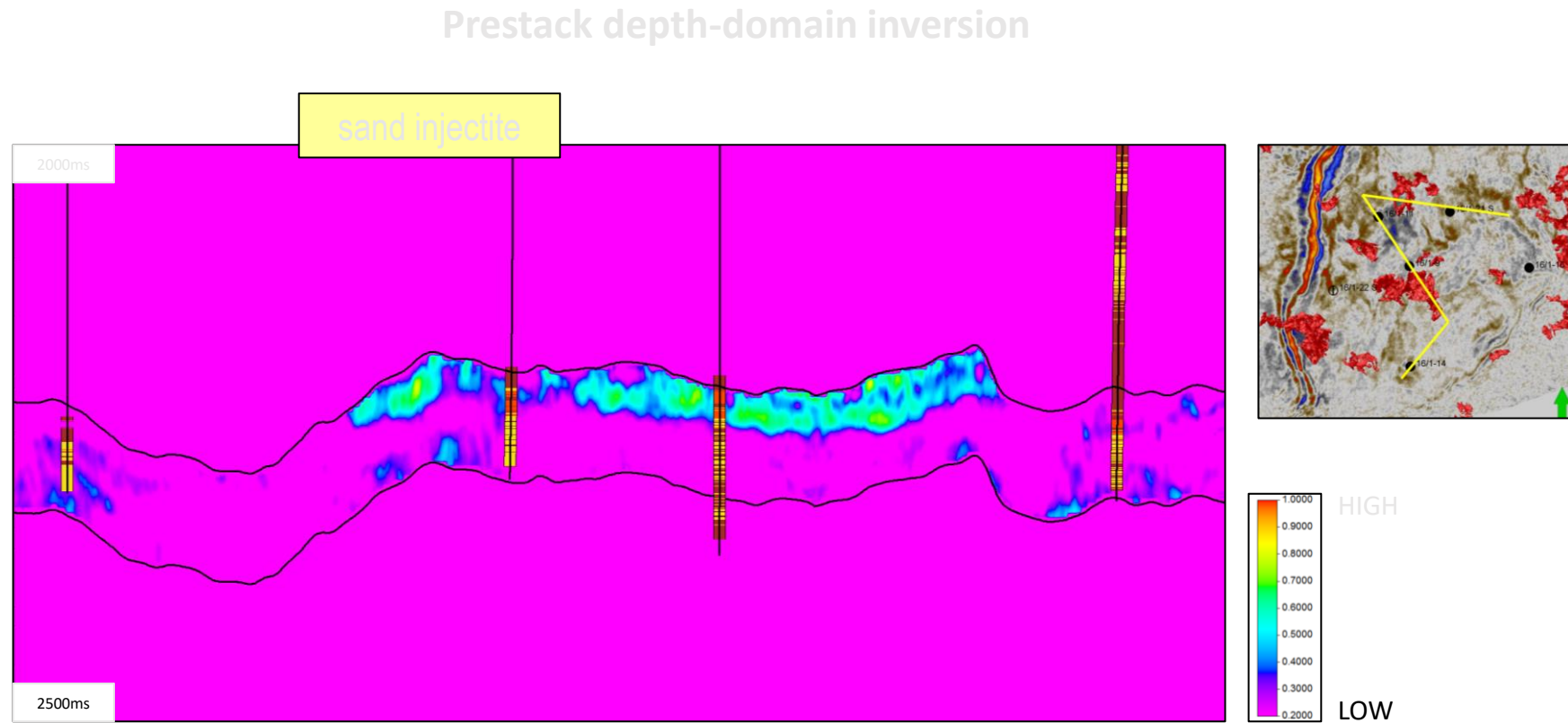
## PP-PS AVO Inversion



**PZPS Event Matching and Simultaneous Inversion - A Critical Input to 3D Mechanical Earth Modeling**

A. Murineddu, A.Rasmussen, F.R. Mohamed, A.S. Wendt, M.Nickel - 70° EAGE Conference and Exhibition

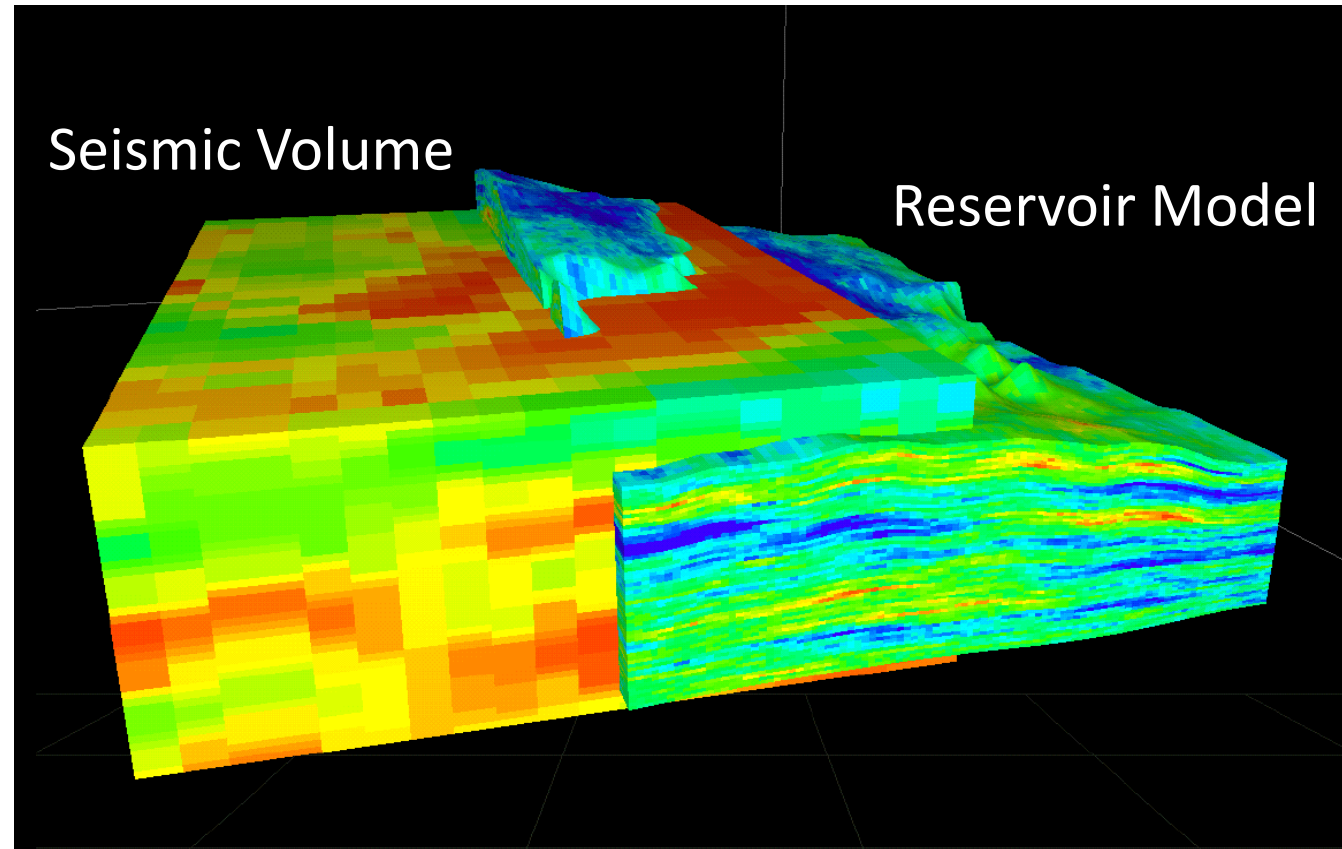
# Example 3 : Hydrocarbon sand probability



✓ Sand injectites imprint mitigated -> more reliable lithology classification

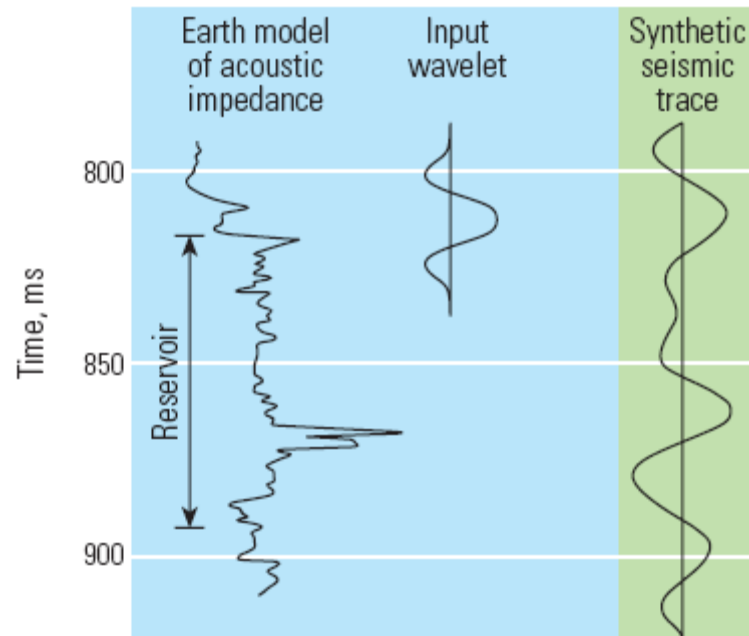
# Stochastic Seismic Inversion

# Issues of Scale in Reservoir Modelling

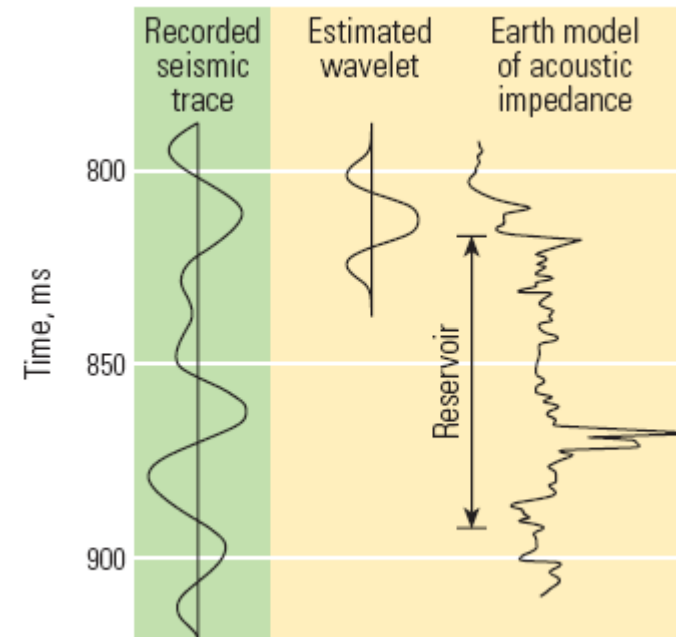


# Forward Modelling & Inversion\*

Forward Modelling

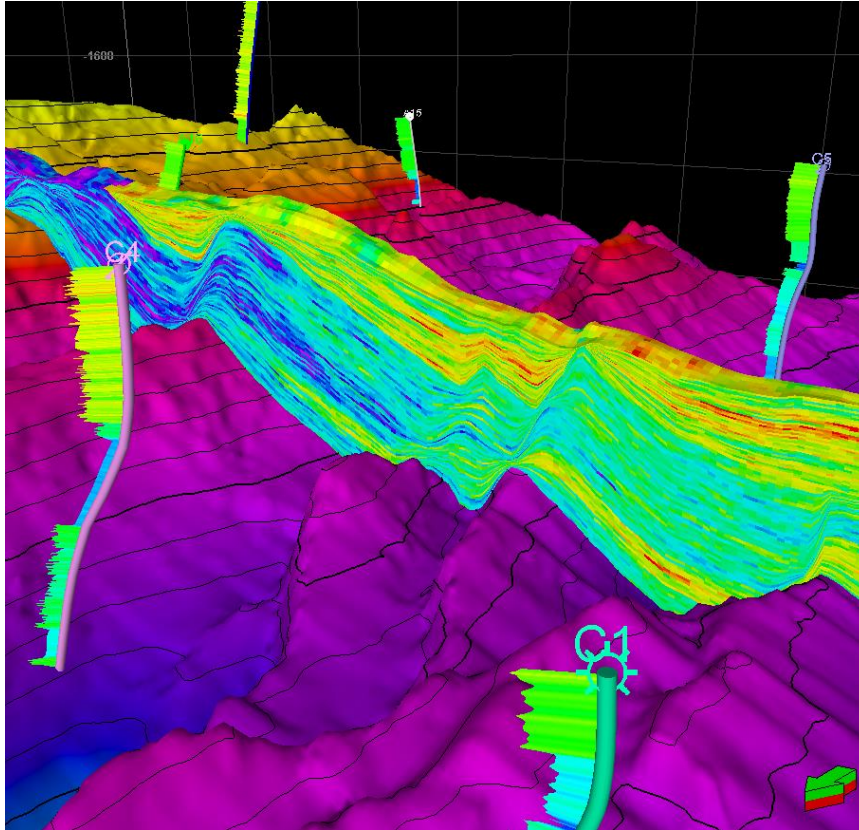


Inversion



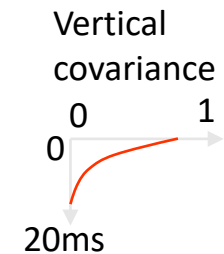
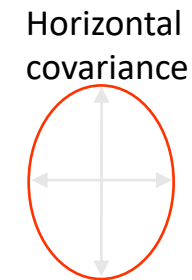
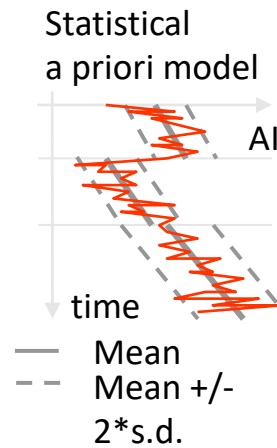
\*Seismic Inversion: Reading Between the Lines, Oilfield Review, Spring 2008

# Post-stack Stochastic Inversion

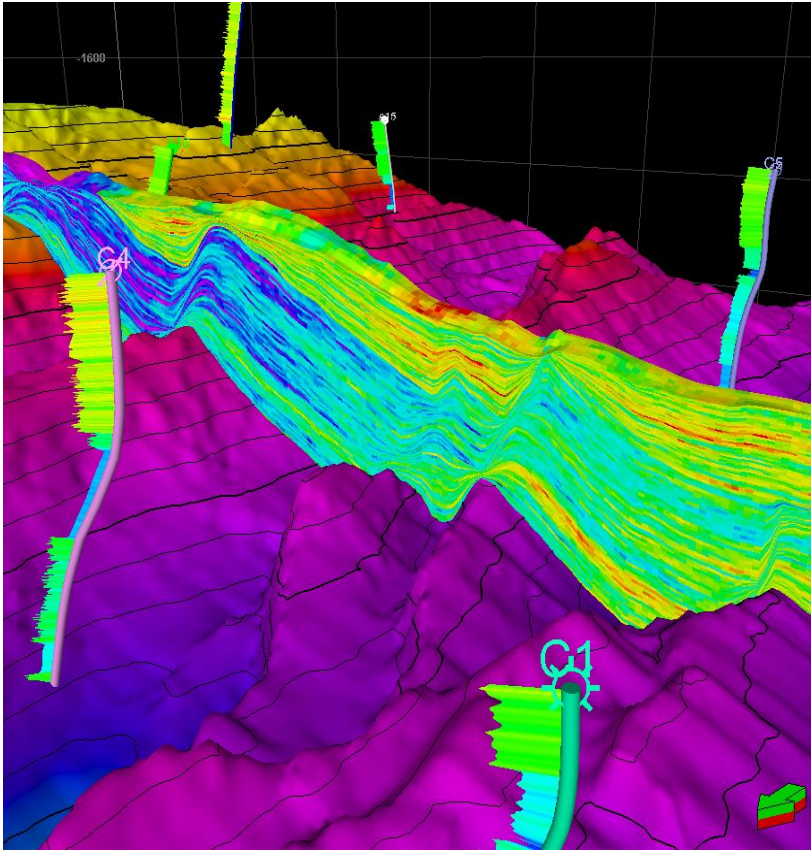


Impedance models constrained to:

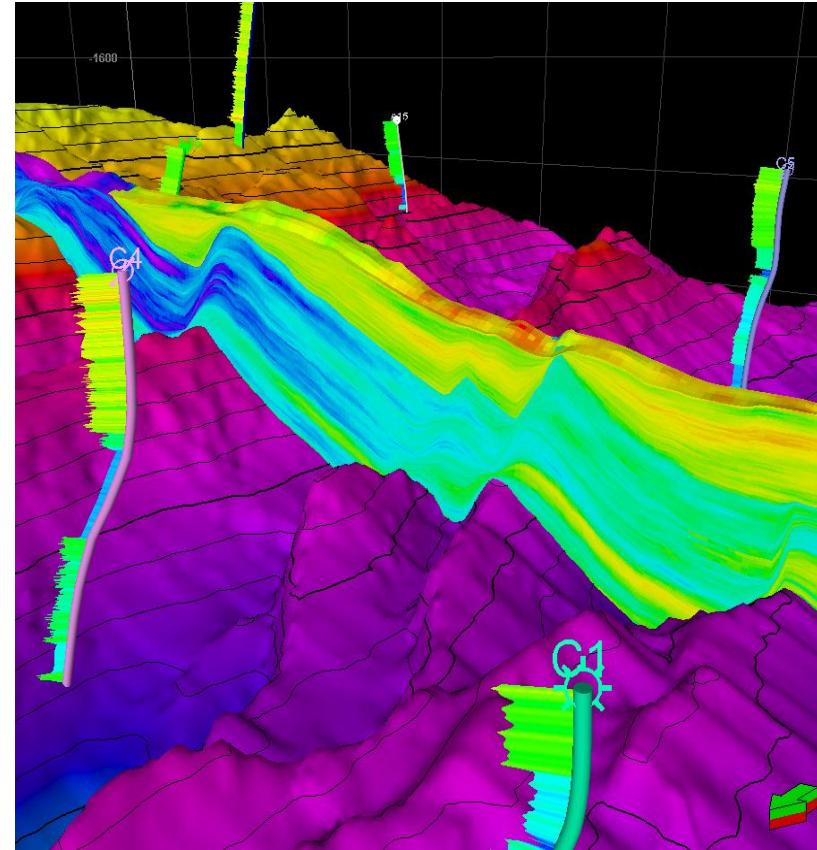
- Seismic amplitudes
- Geological model (Petrel pillar grid)
- 3D a priori model
- 3D heterogeneity model



# Stochastic Inversion - Products



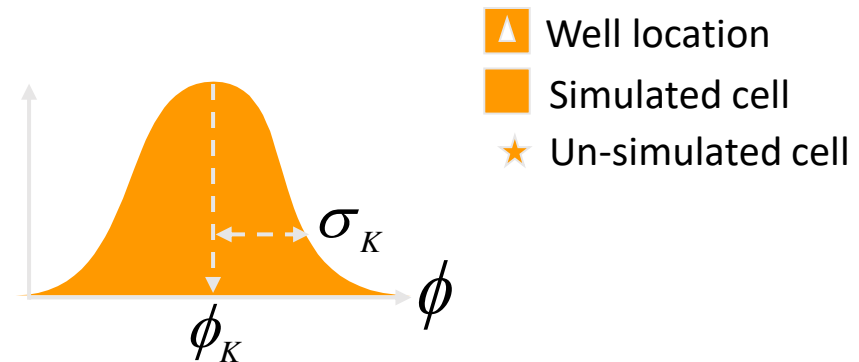
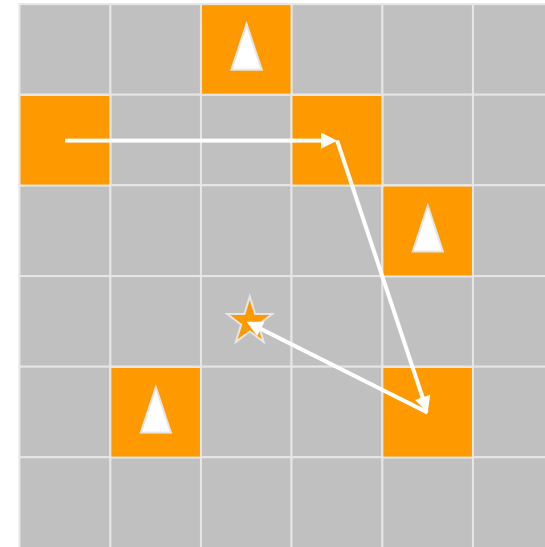
Acoustic Impedance Realizations



Mean of 20 realizations

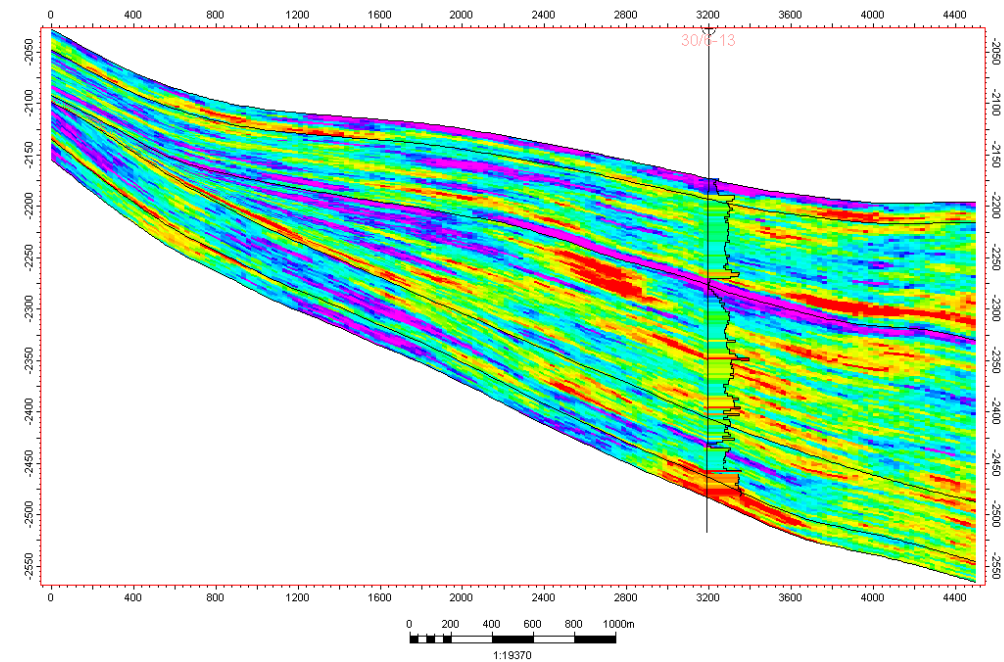
# Sequential Gaussian Simulation

1. Pick un-simulated cell at random
2. Compute kriging estimate and variance
3. Draw simulated value at random from conditional distribution
4. Treat simulated value as additional control point
5. Repeat until full grid is simulated

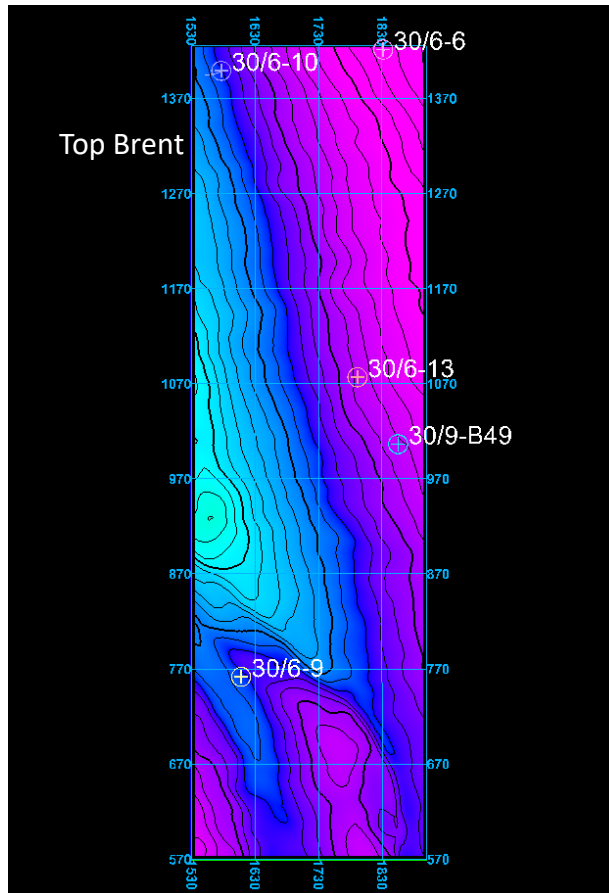


# Section 3.

## Post-Stack Stochastic Inversion of the Oseberg Field



# Area of Interest



- Cropped seismic survey:
  - IL range 570-1425
  - IL length 4627m (18.75m)
  - XL range 1530-1900
  - XL length 16032m (12.5m)
- Well data:
  - 30/6-6, 30/6-9, 30/6-10, 30/6-13, 30/9-B49

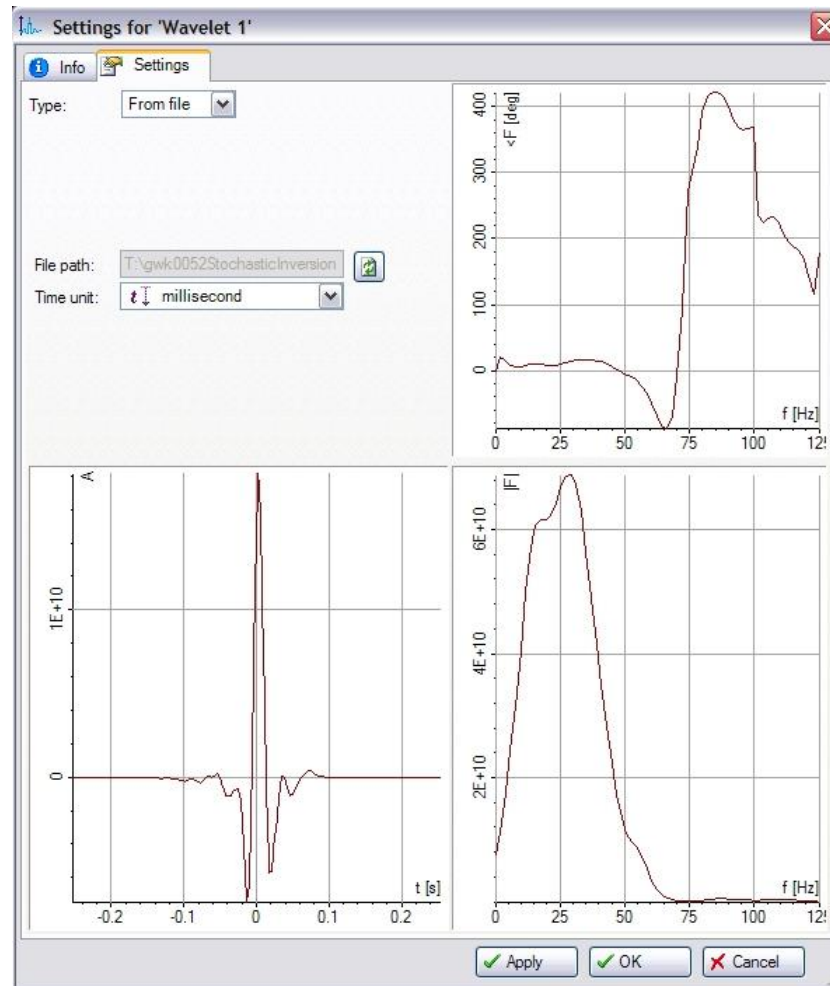
# Workflow - 1

- Input data
  - Post-stack seismic amplitude volume
  - Extracted wavelet
  - Interpreted seismic horizons
  - Well logs
  - Time-depth curves

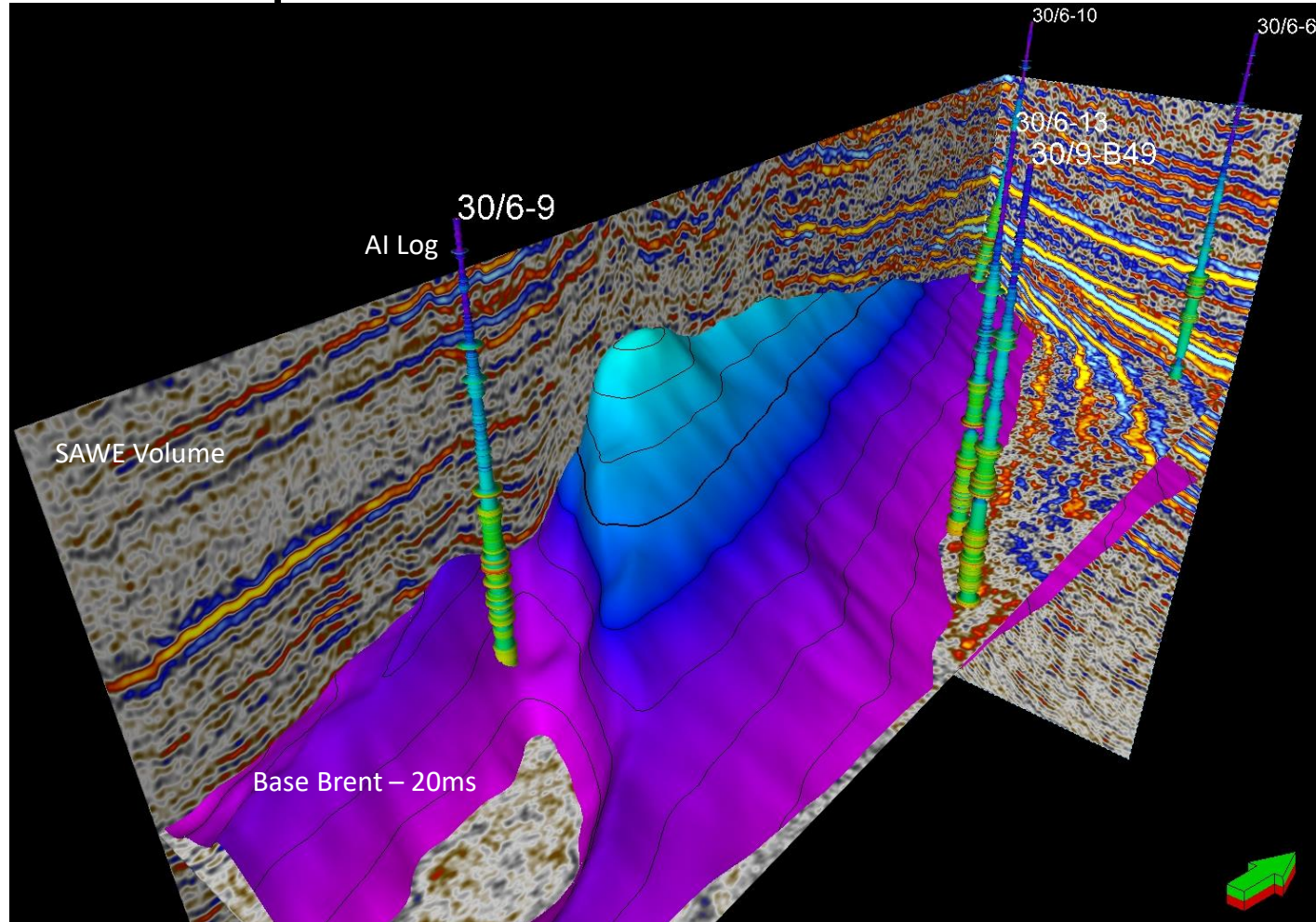
# Workflow - 2

- Structural model building (time domain)
  - Fault modelling, create zones and layering
- Upscaling well log AI into structural model
- Variogram analysis and modelling
- Prior model building
- Inversion QC

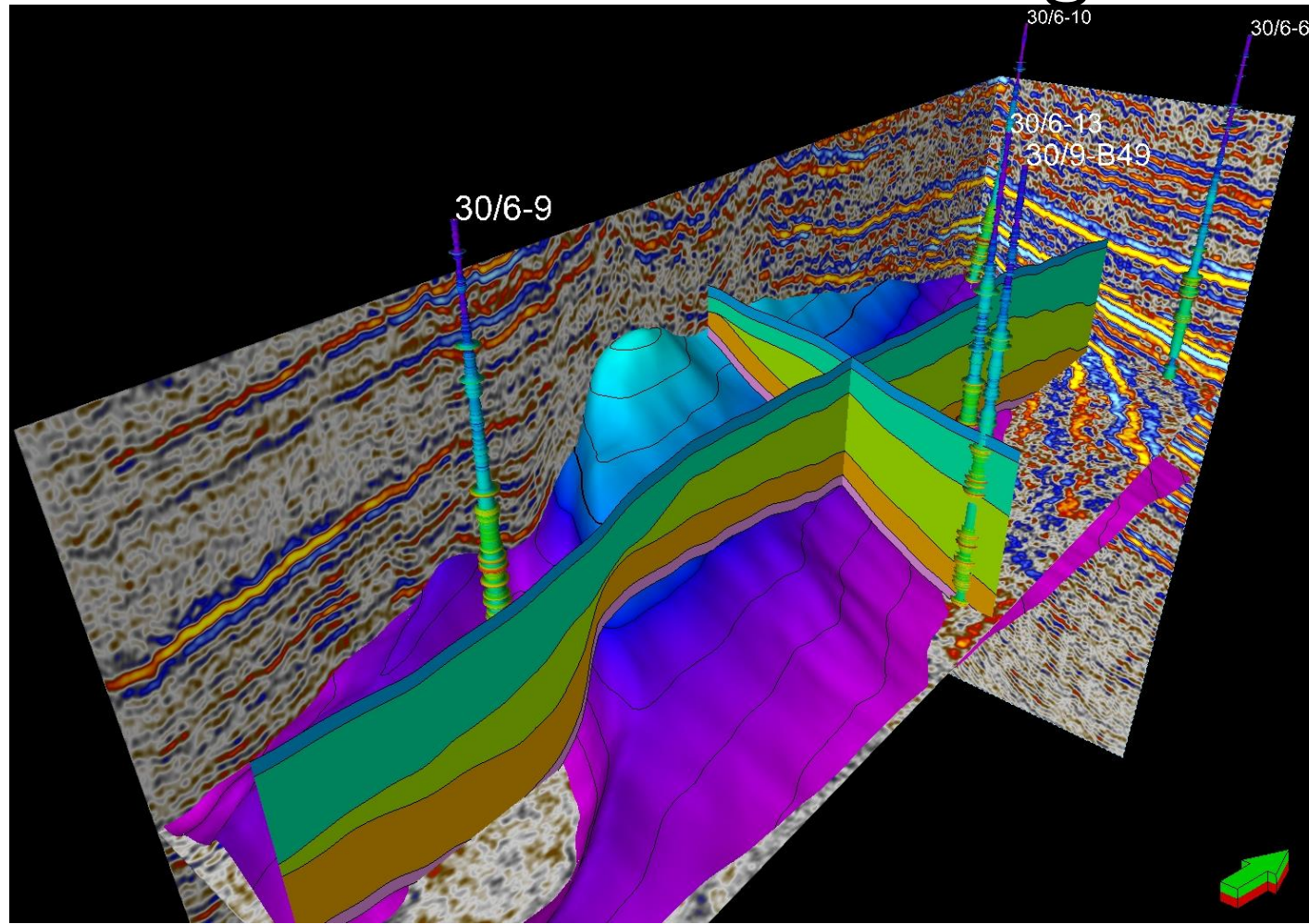
# Workflow – Input Wavelet



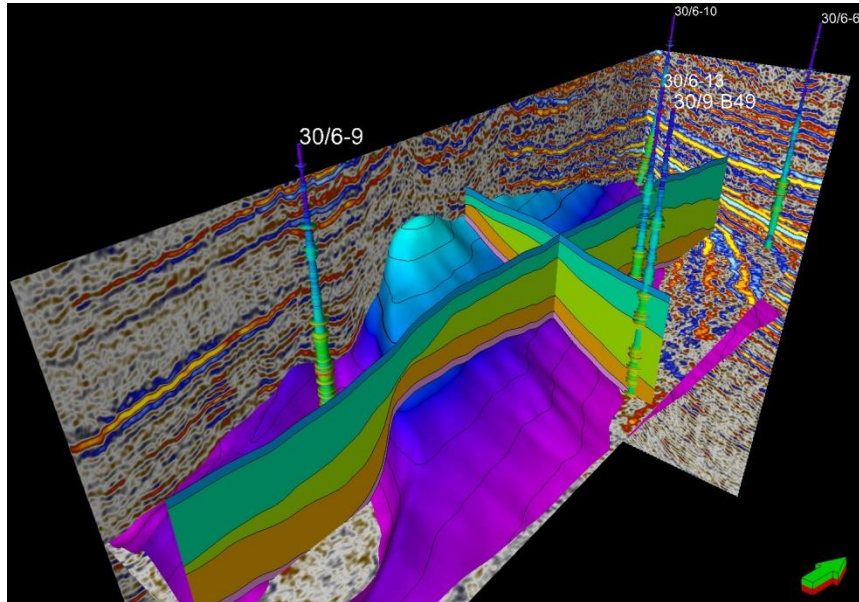
# Workflow - Input Data



# Workflow – Structural Modelling

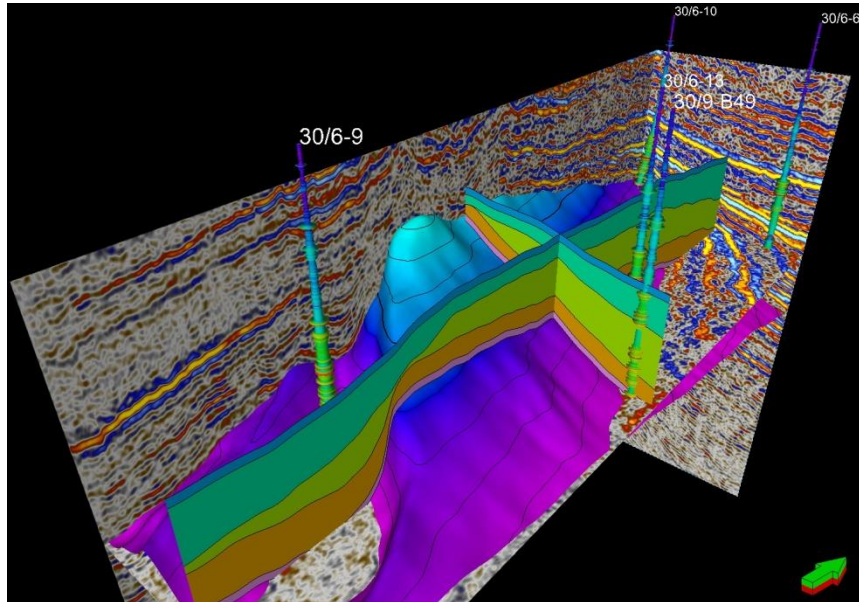


# Workflow – Grid Zonation













- Five zones:
  - TCRET+20 to TCRET
  - TCRET to BCRET
  - BCRET to TBRENT
  - TBRENT to BBRENT
  - BBRENT to BBRENT-20

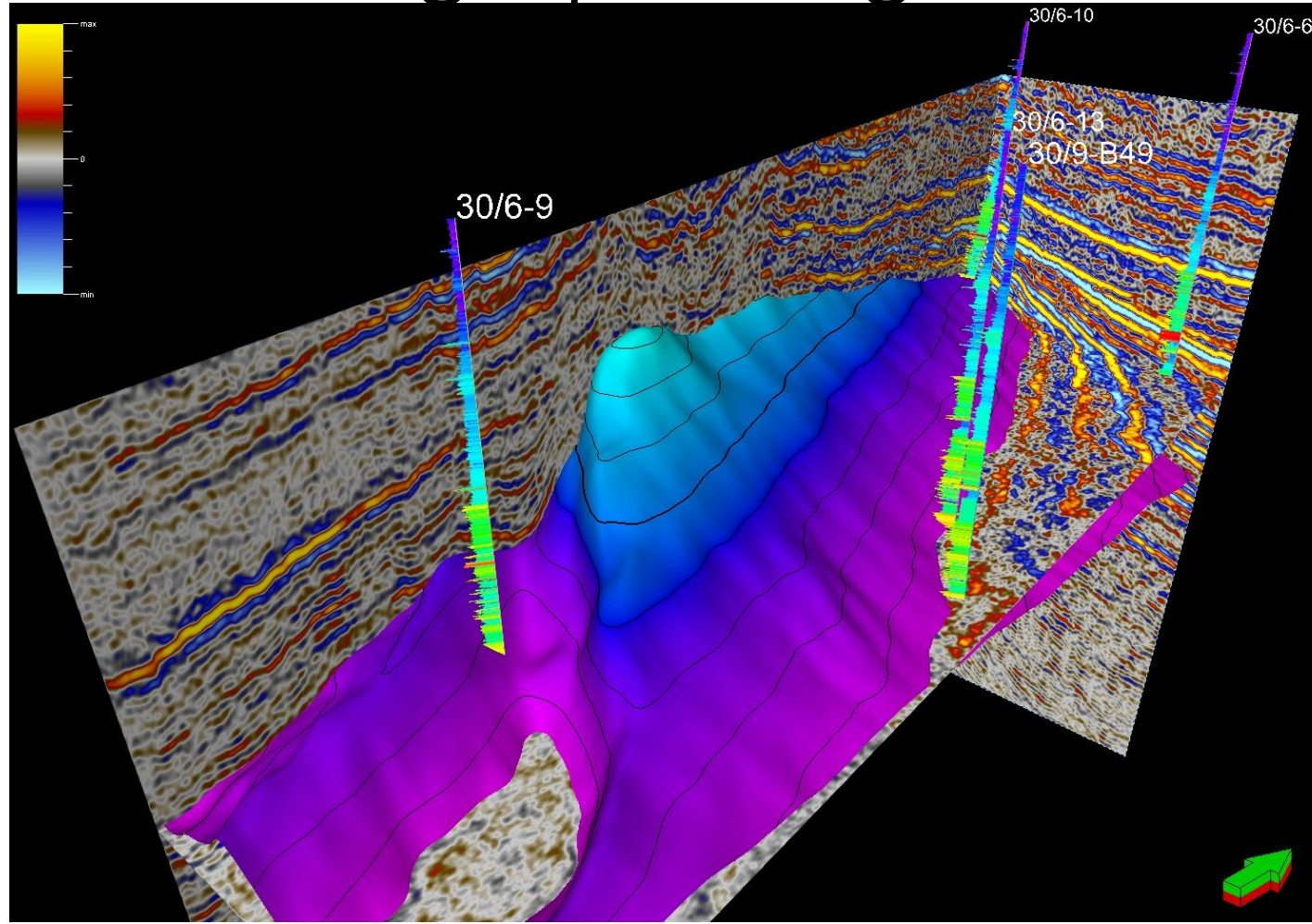
# Workflow – Grid Layering



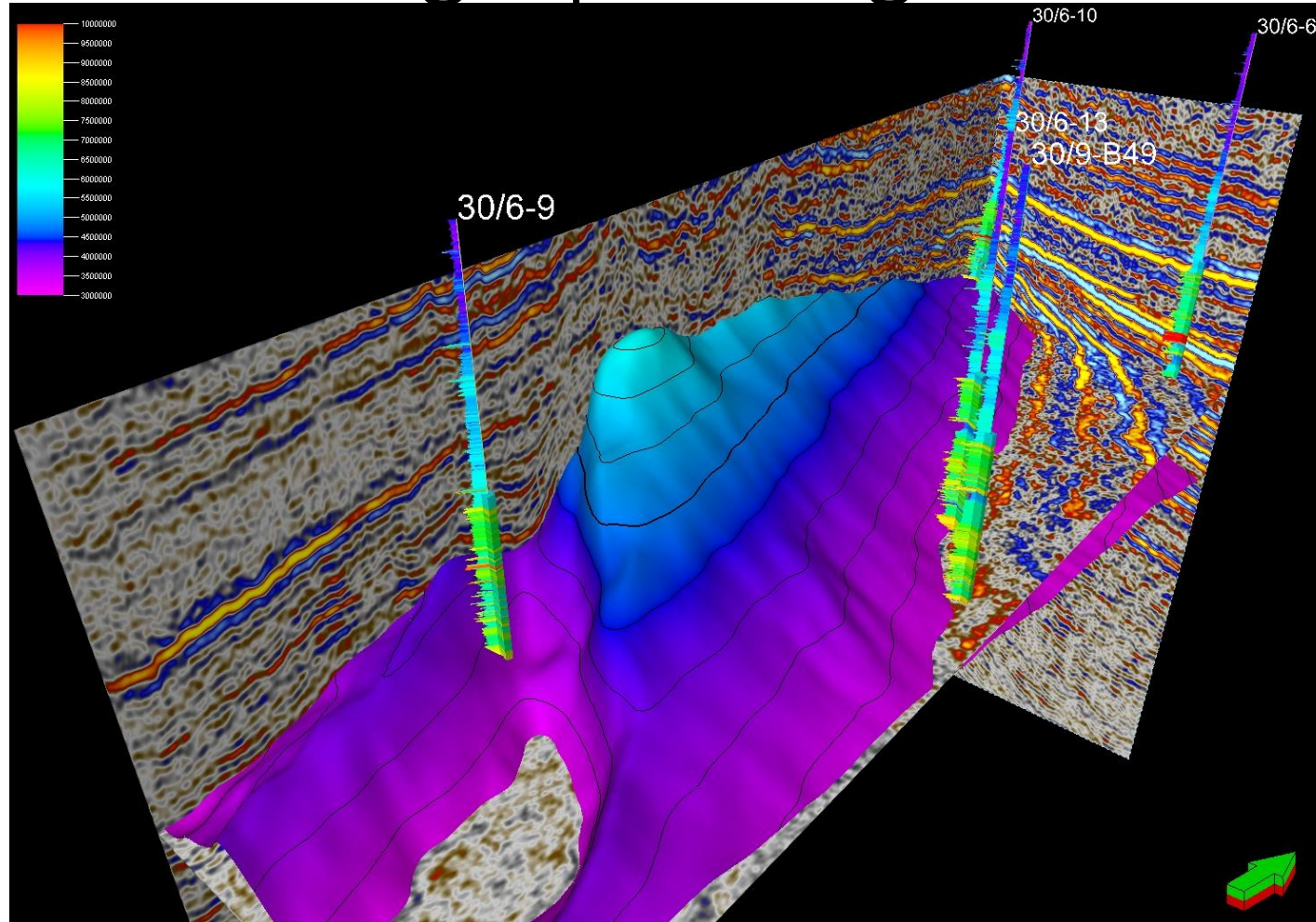
- Number of cells:  
 $NI \times NJ \times NK =$   
 $180 \times 638 \times 180 = 20671200$
- Cell size:  
 $25m \times 25m \times 1.785ms$

	Name	Color	Calculate	Zone division		
	Zone 1		<input checked="" type="checkbox"/> Yes	Proportional	Number of layers:	10
	Zone 2		<input checked="" type="checkbox"/> Yes	Proportional	Number of layers:	40
	Zone 3		<input checked="" type="checkbox"/> Yes	Proportional	Number of layers:	60
	Zone 4		<input checked="" type="checkbox"/> Yes	Follow base	Cell thickness:	2.00
	Zone 5		<input checked="" type="checkbox"/> Yes	Proportional	Number of layers:	10

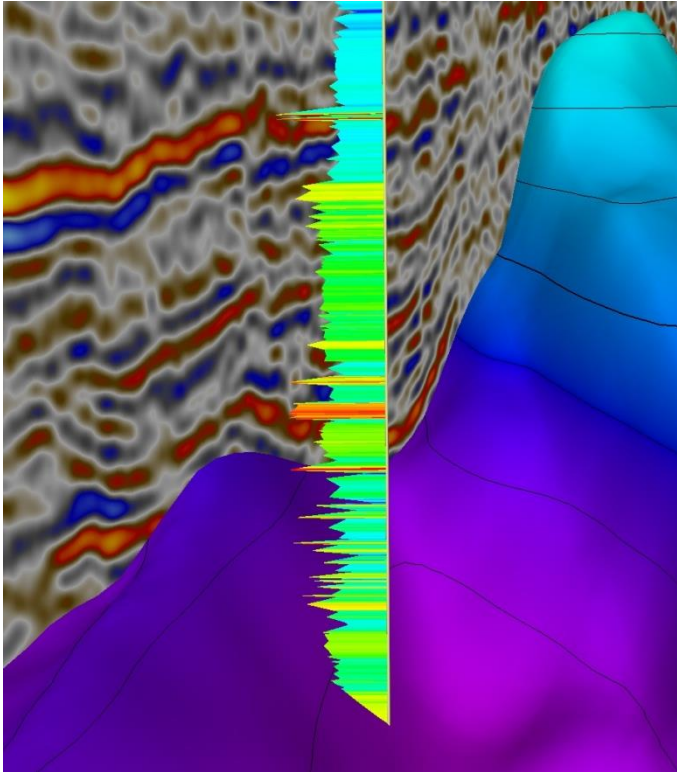
# Workflow – AI Log Upscaling



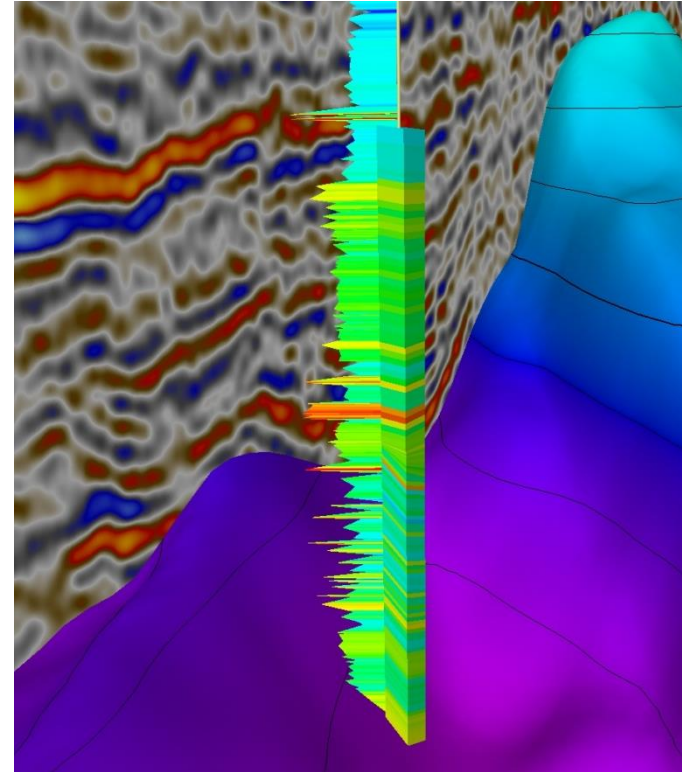
# Workflow – AI Log Upscaling



# Workflow – AI Log Upscaling

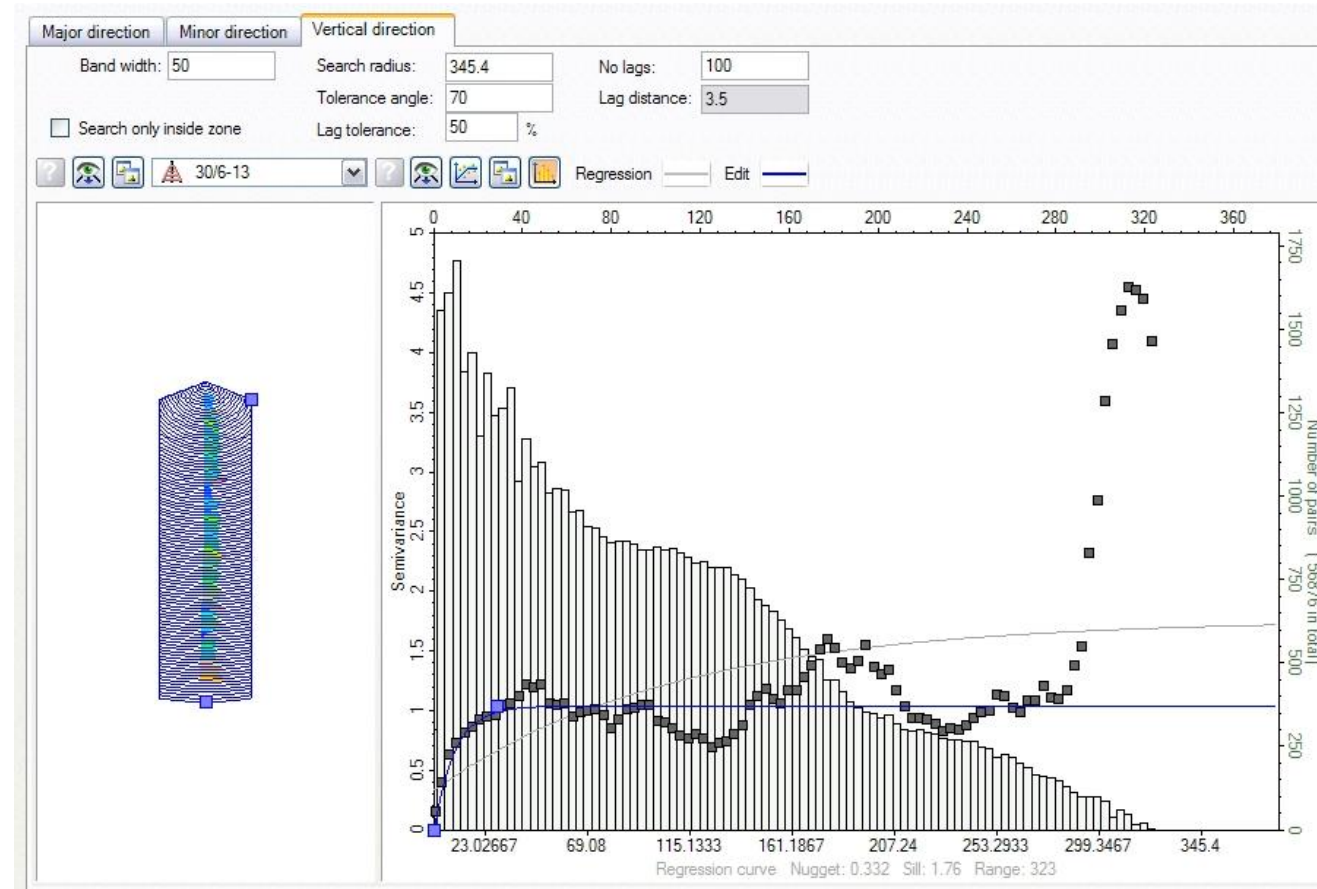


AI Log



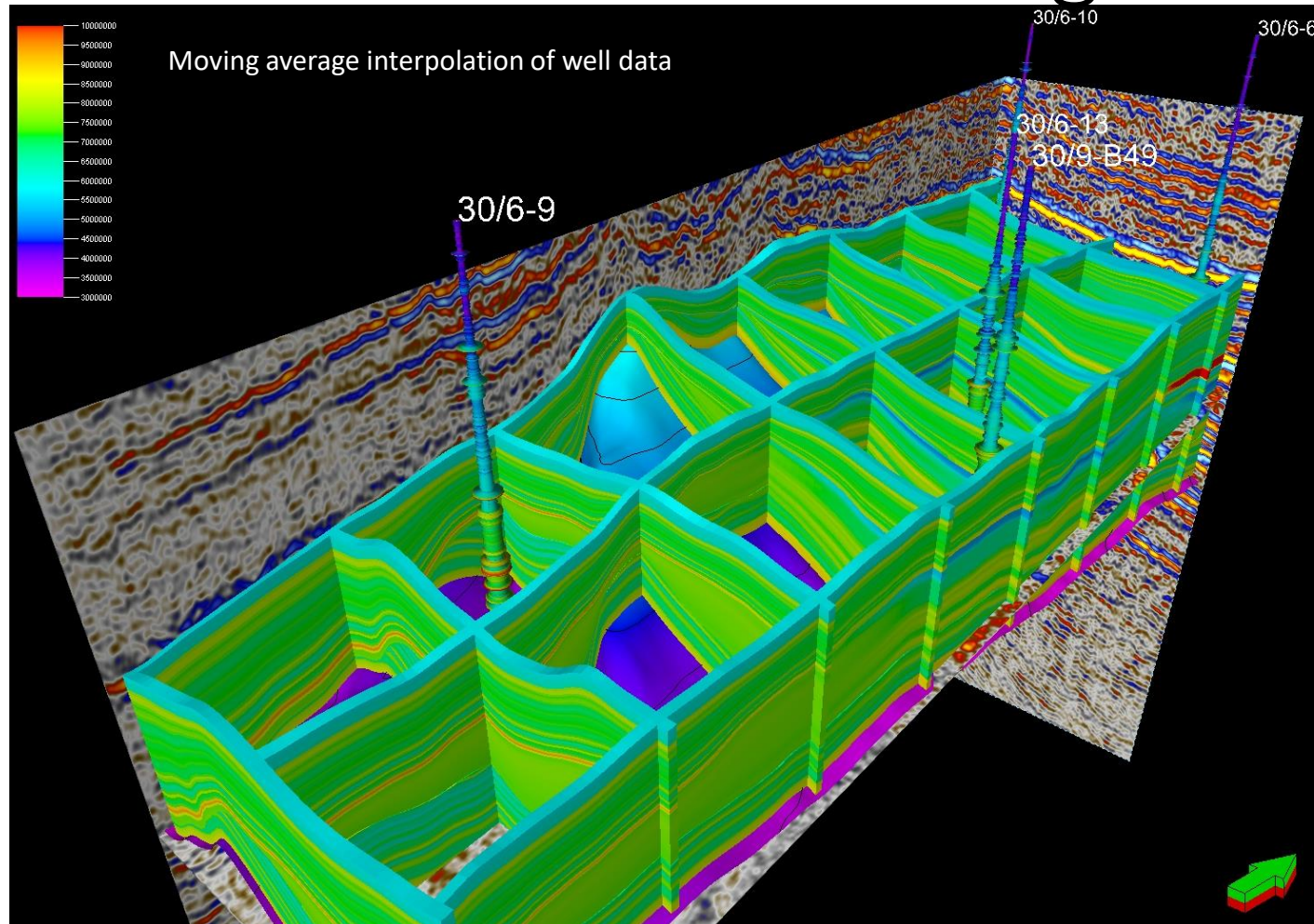
Upscaled AI Log

# Workflow – Variogram Modelling

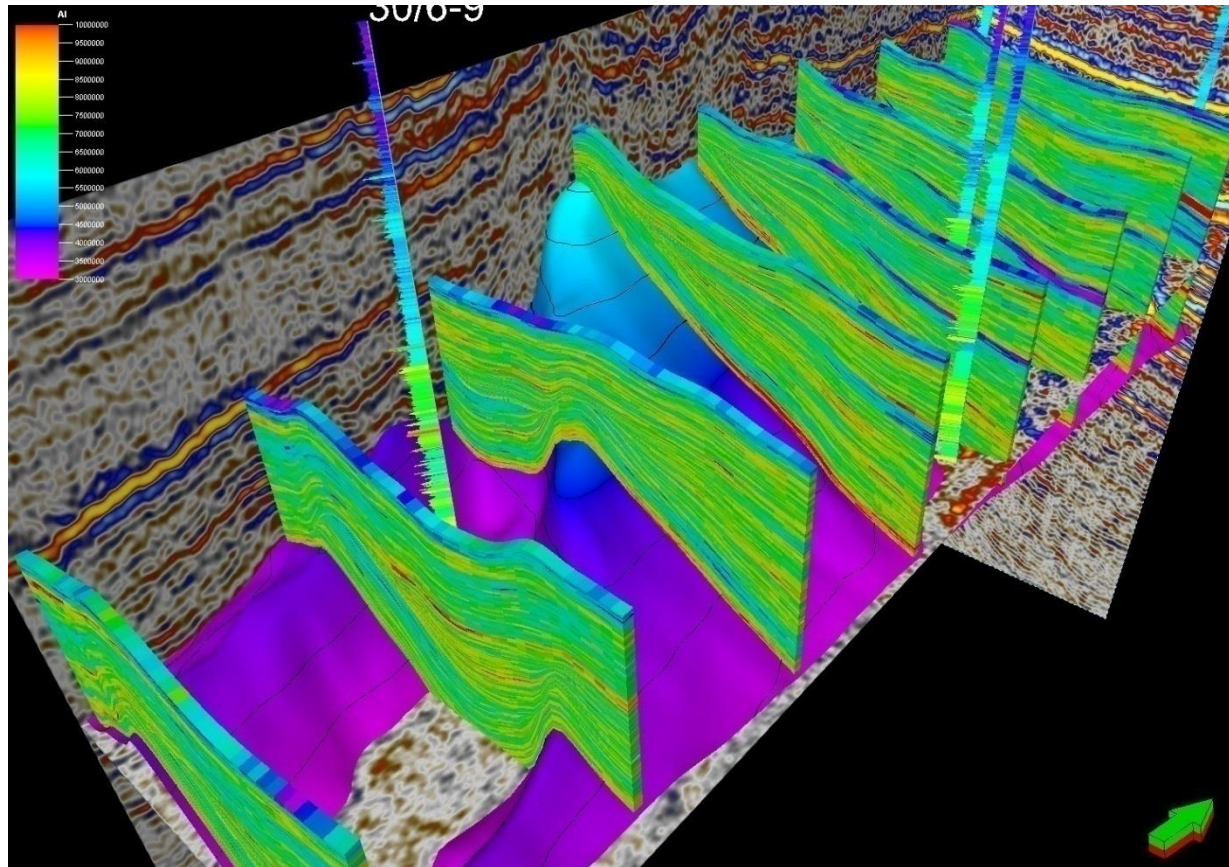


Vertical direction

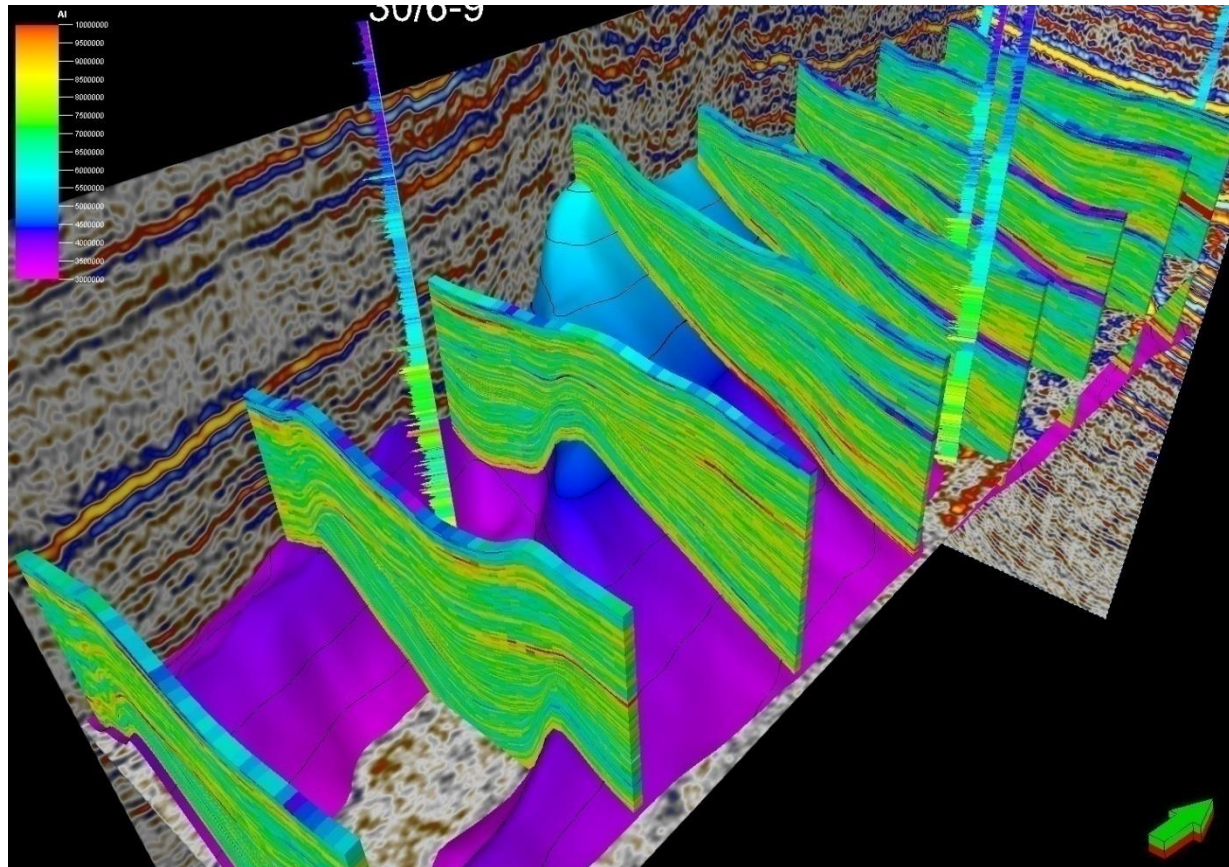
# Workflow – Prior Model Building



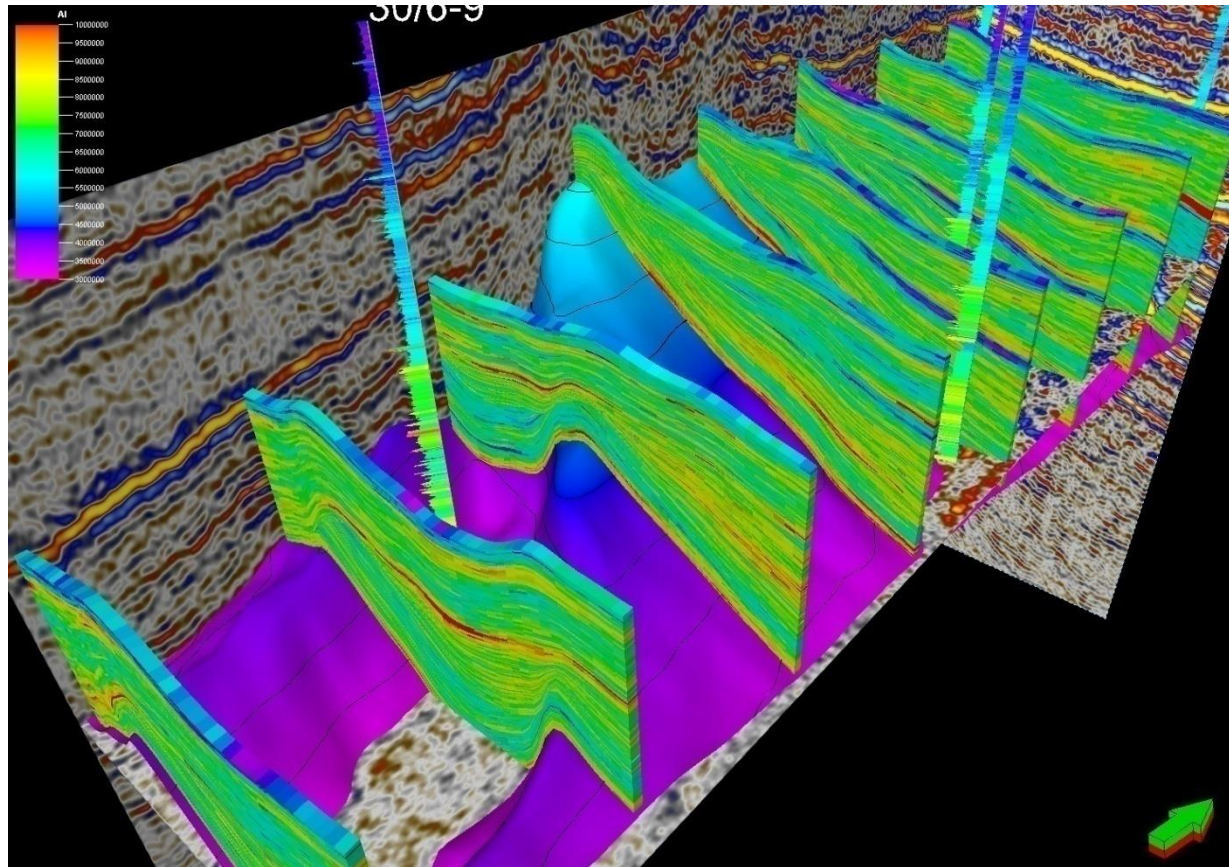
# Workflow – Realization #1



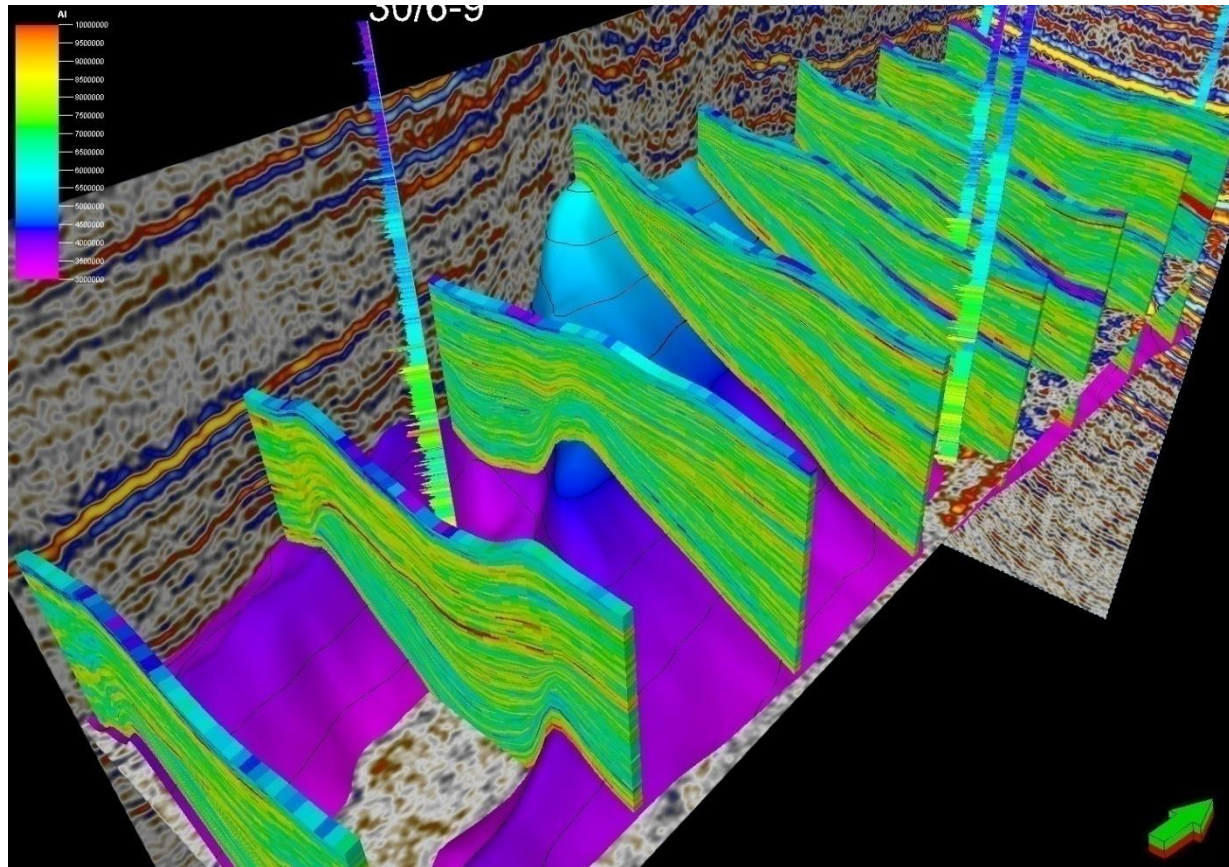
# Workflow – Realization #2



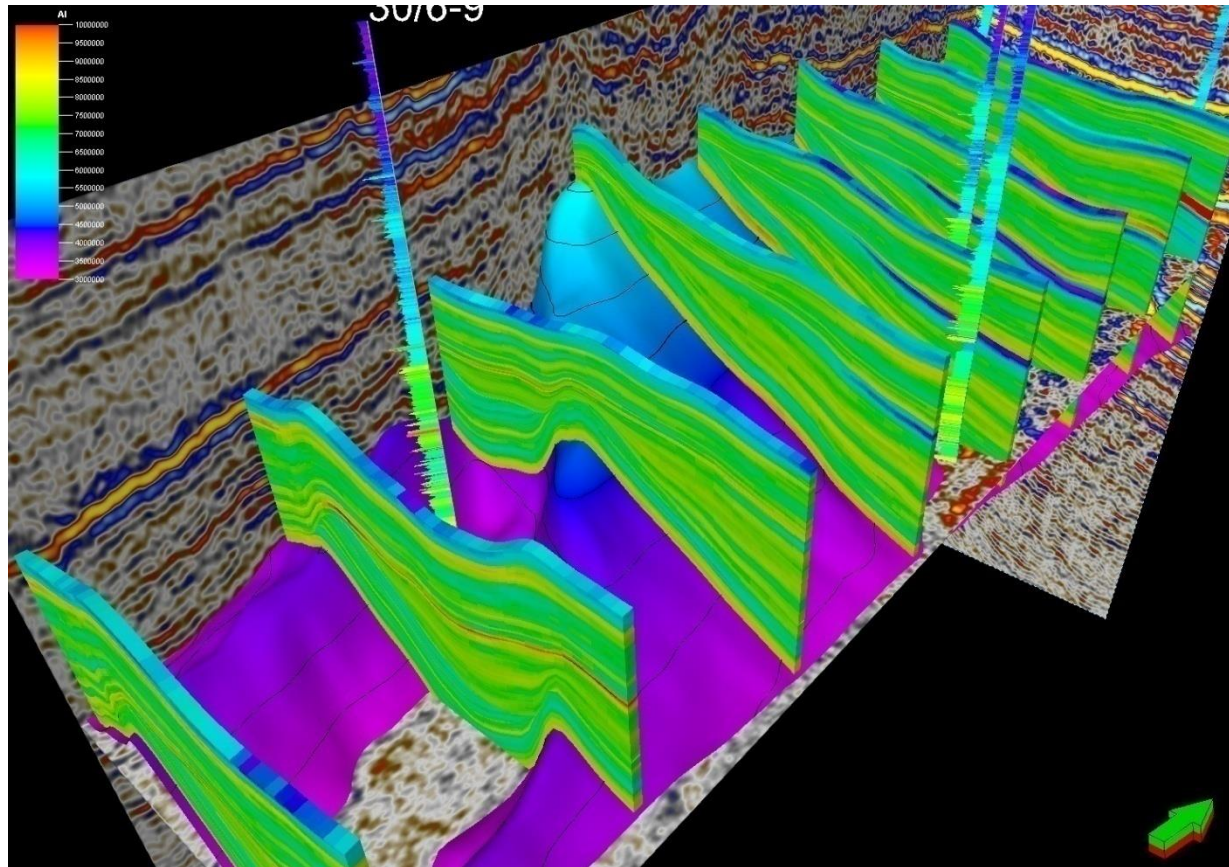
# Workflow – Realization #3



# Workflow – Realization #4

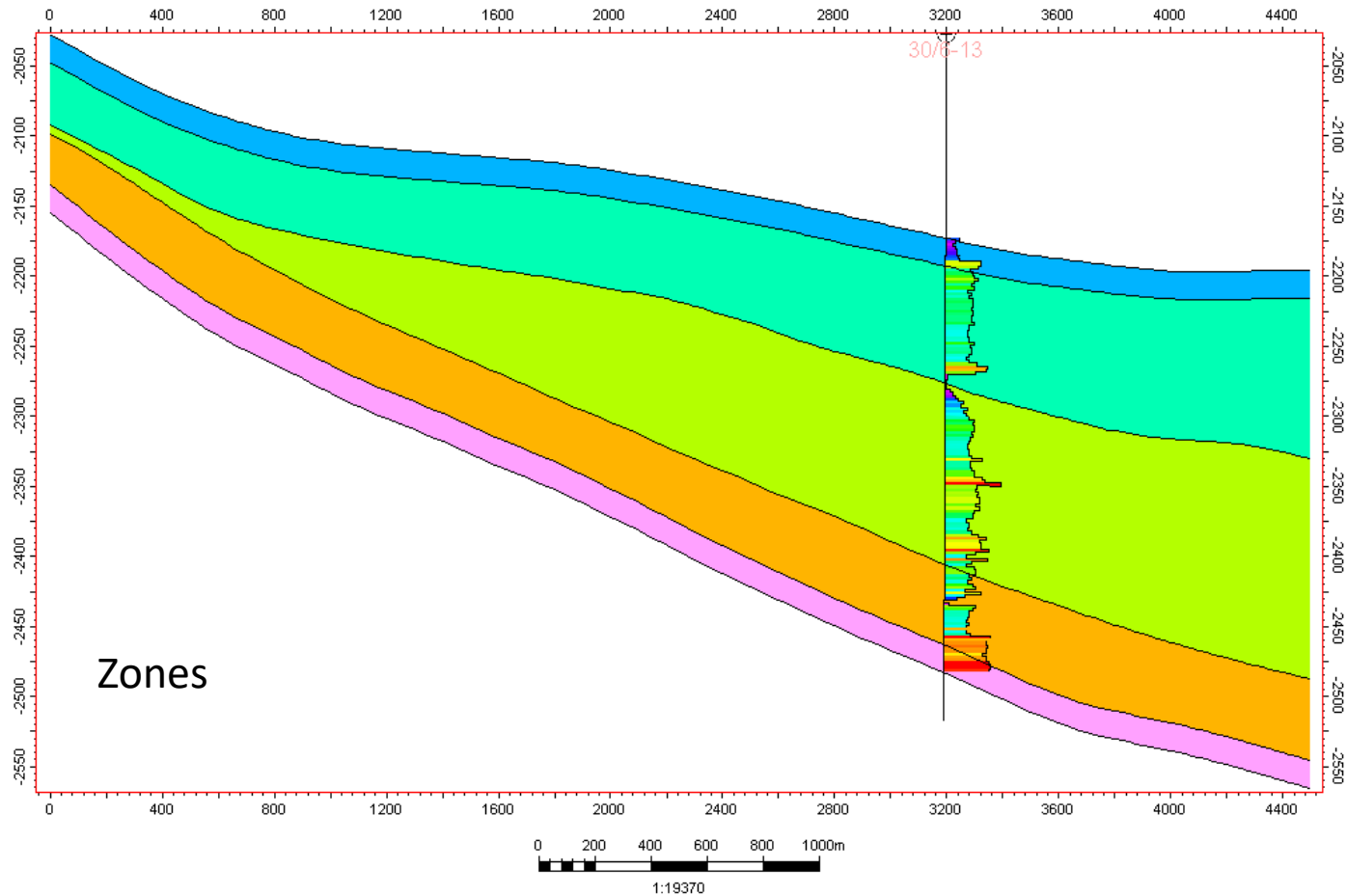


# Workflow – Mean of 100 Realizations

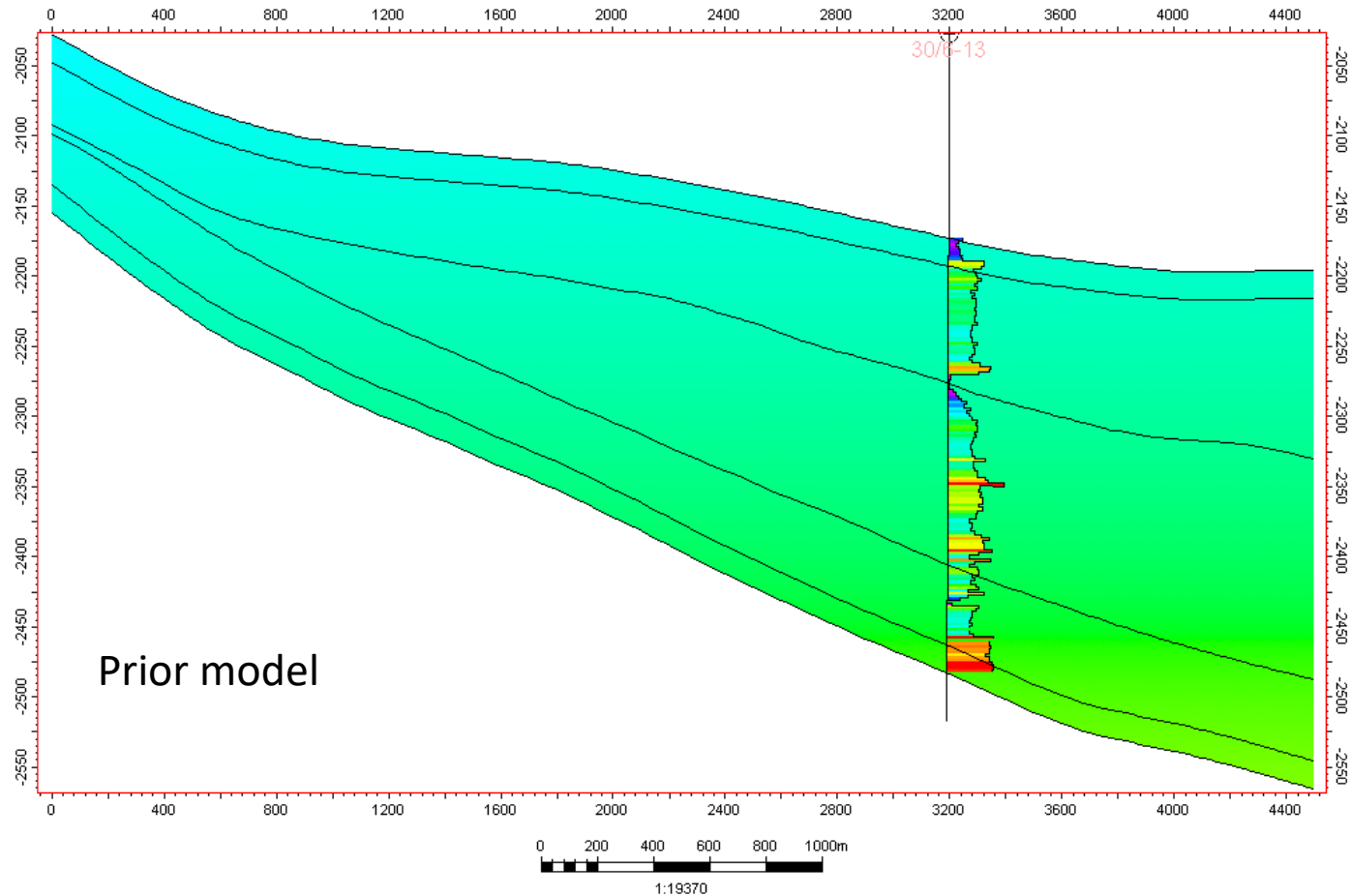


# Cross-sections through 30/6-13

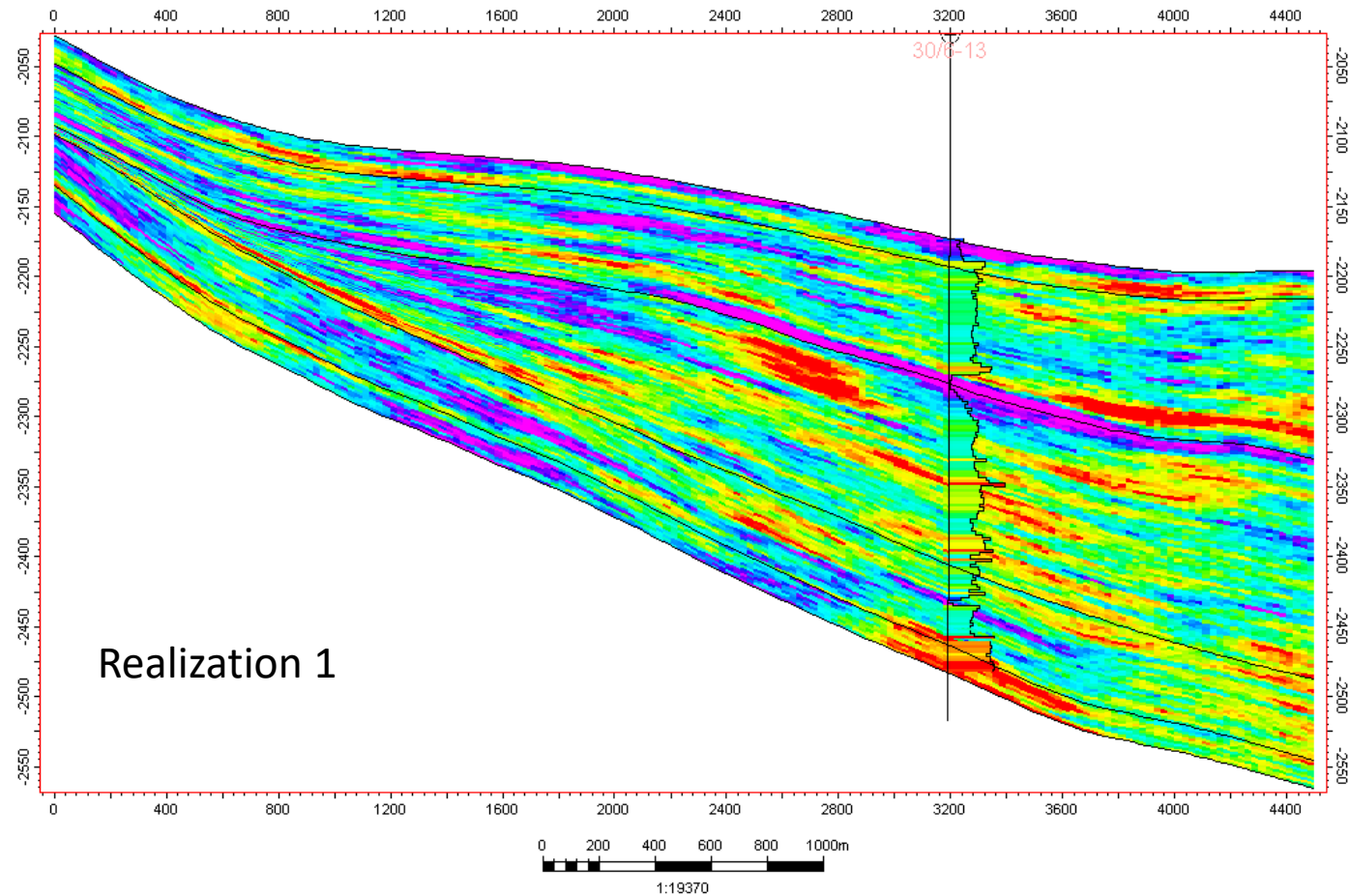
# Cross-Section – 30/6-13



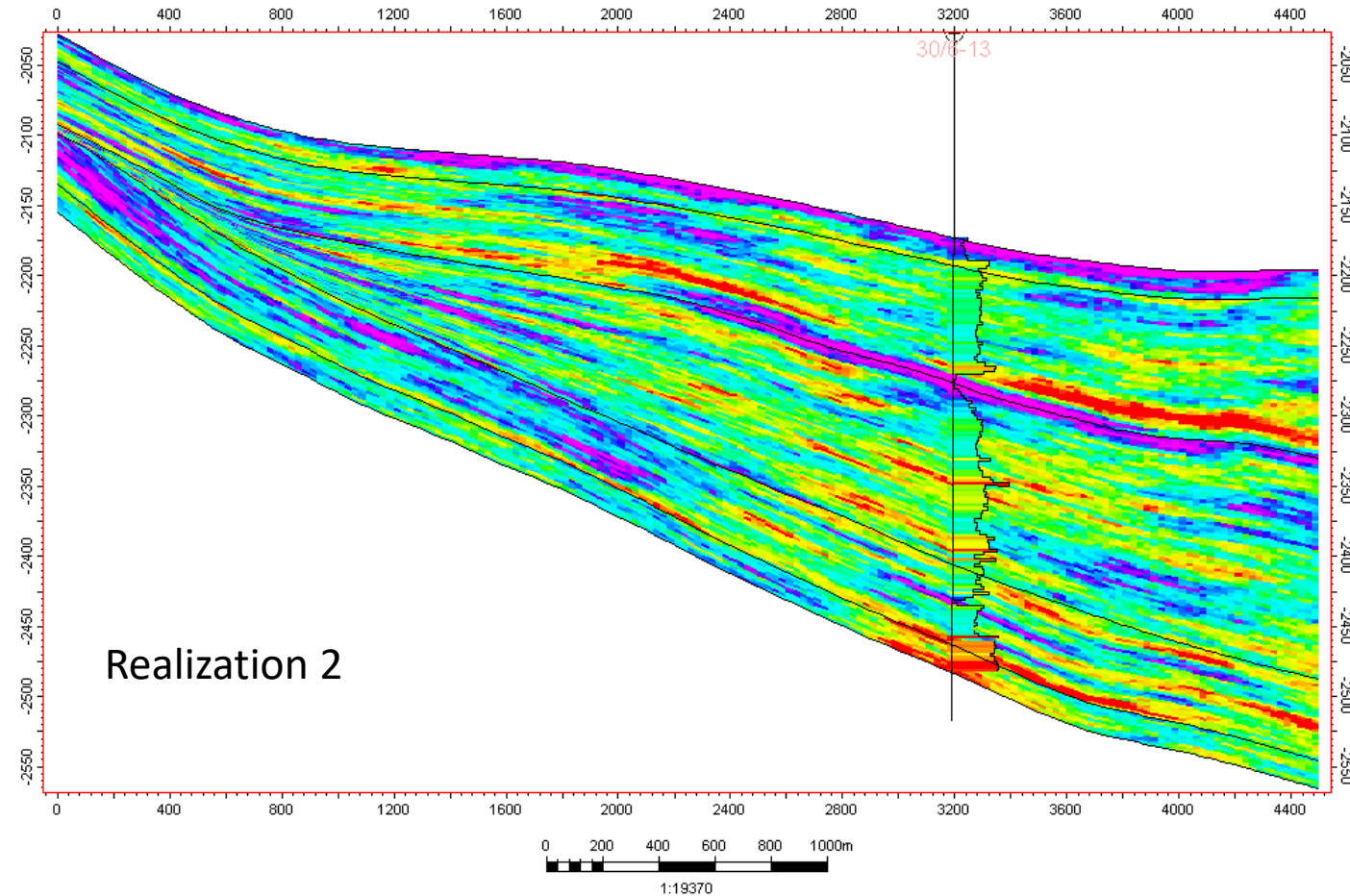
# Cross-Section – 30/6-13



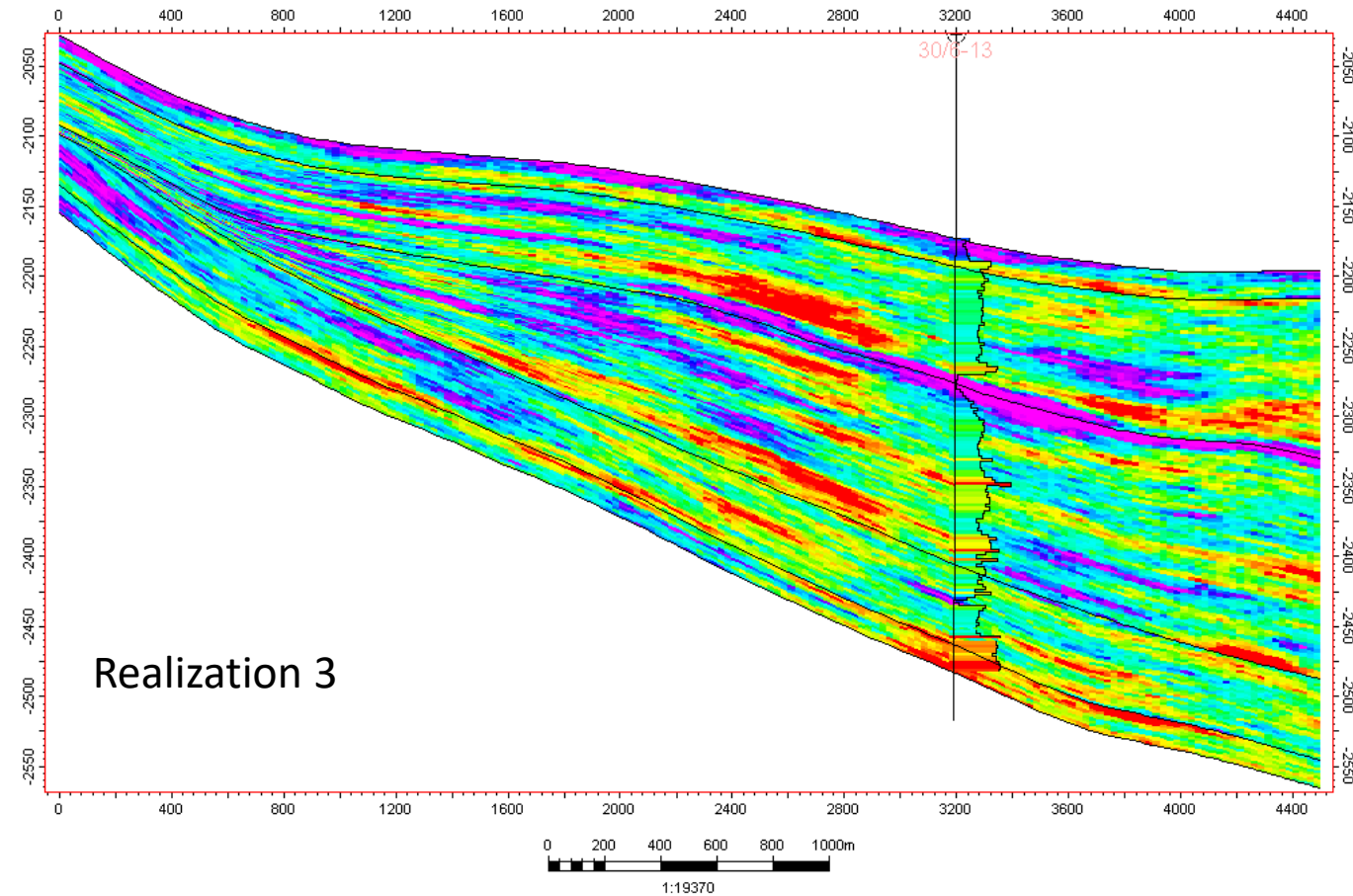
# Cross-Section – 30/6-13



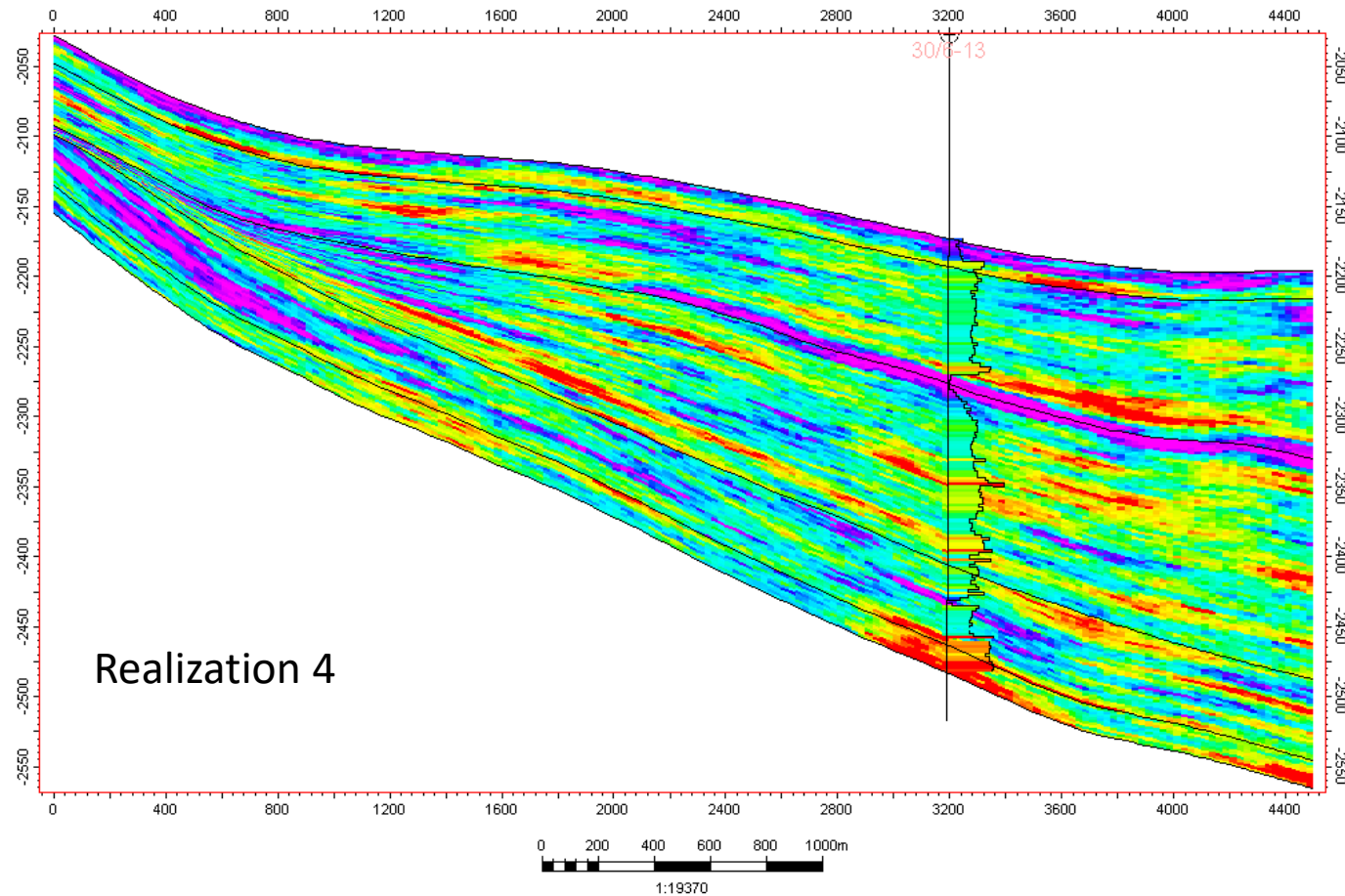
# Cross-Section – 30/6-13



# Cross-Section – 30/6-13



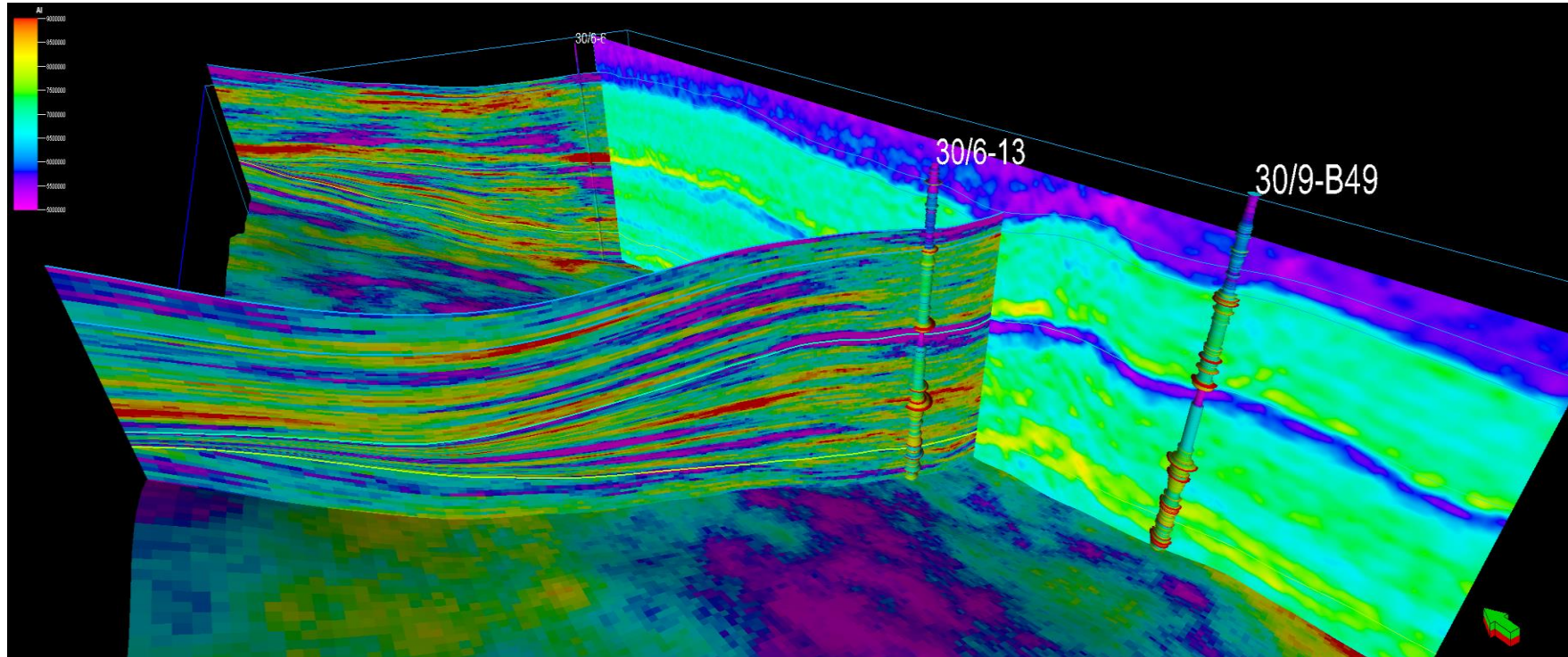
# Cross-Section – 30/6-13



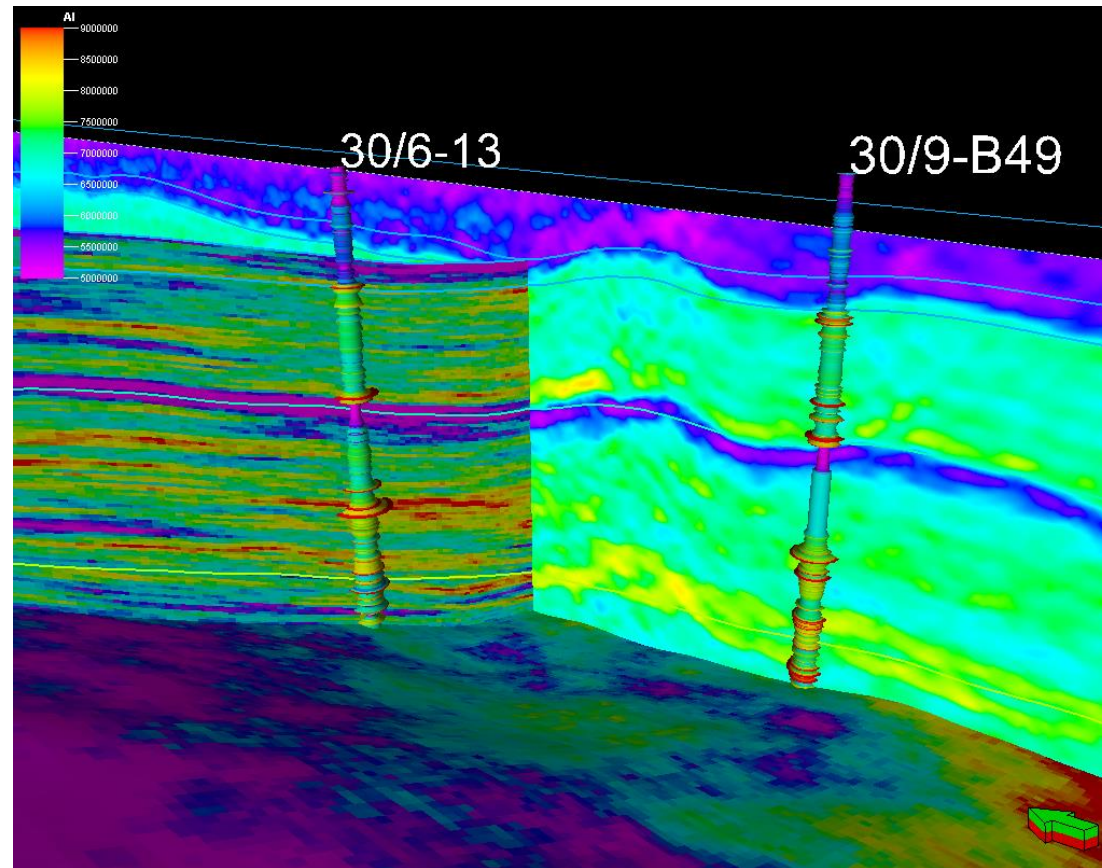
# Section 4.

## Comparing stochastic and deterministic inversions

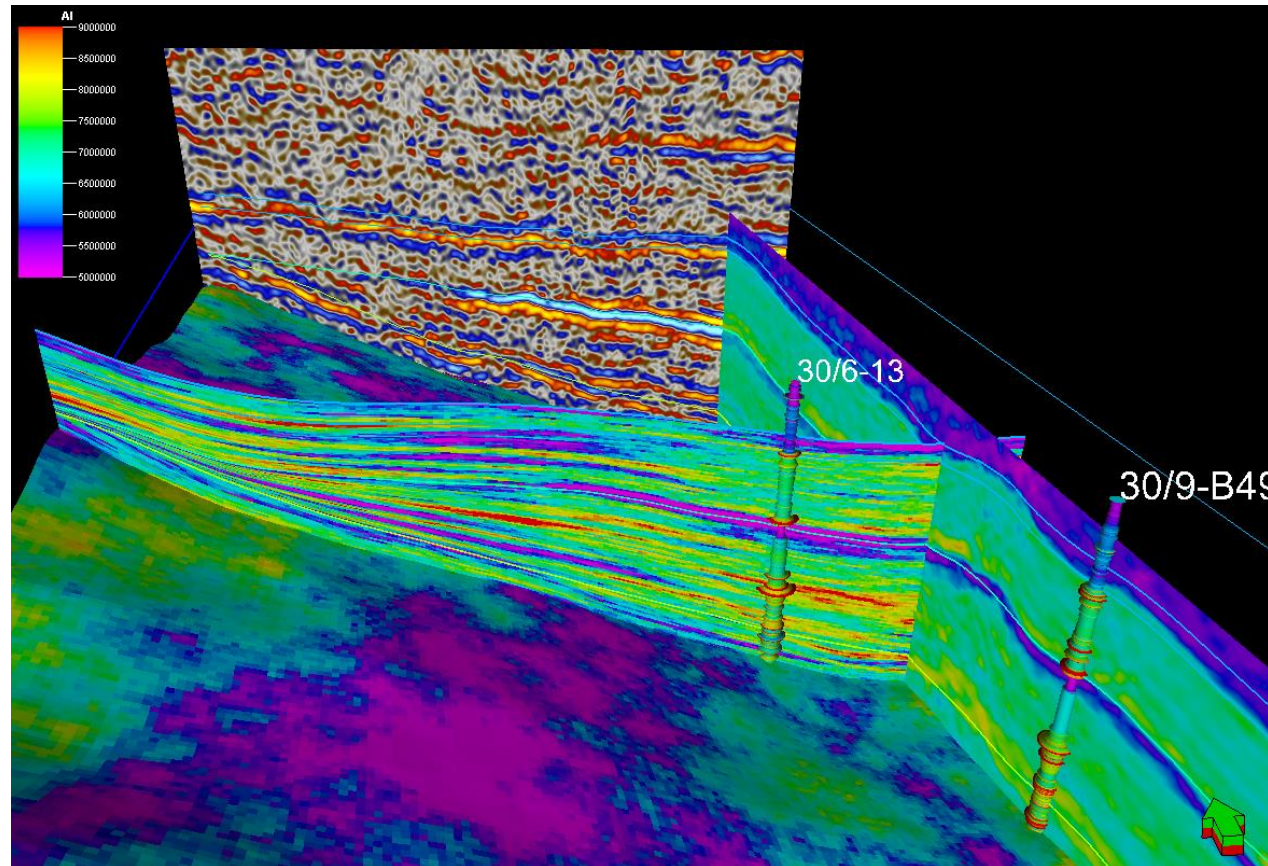
# Stochastic-Deterministic Comparison



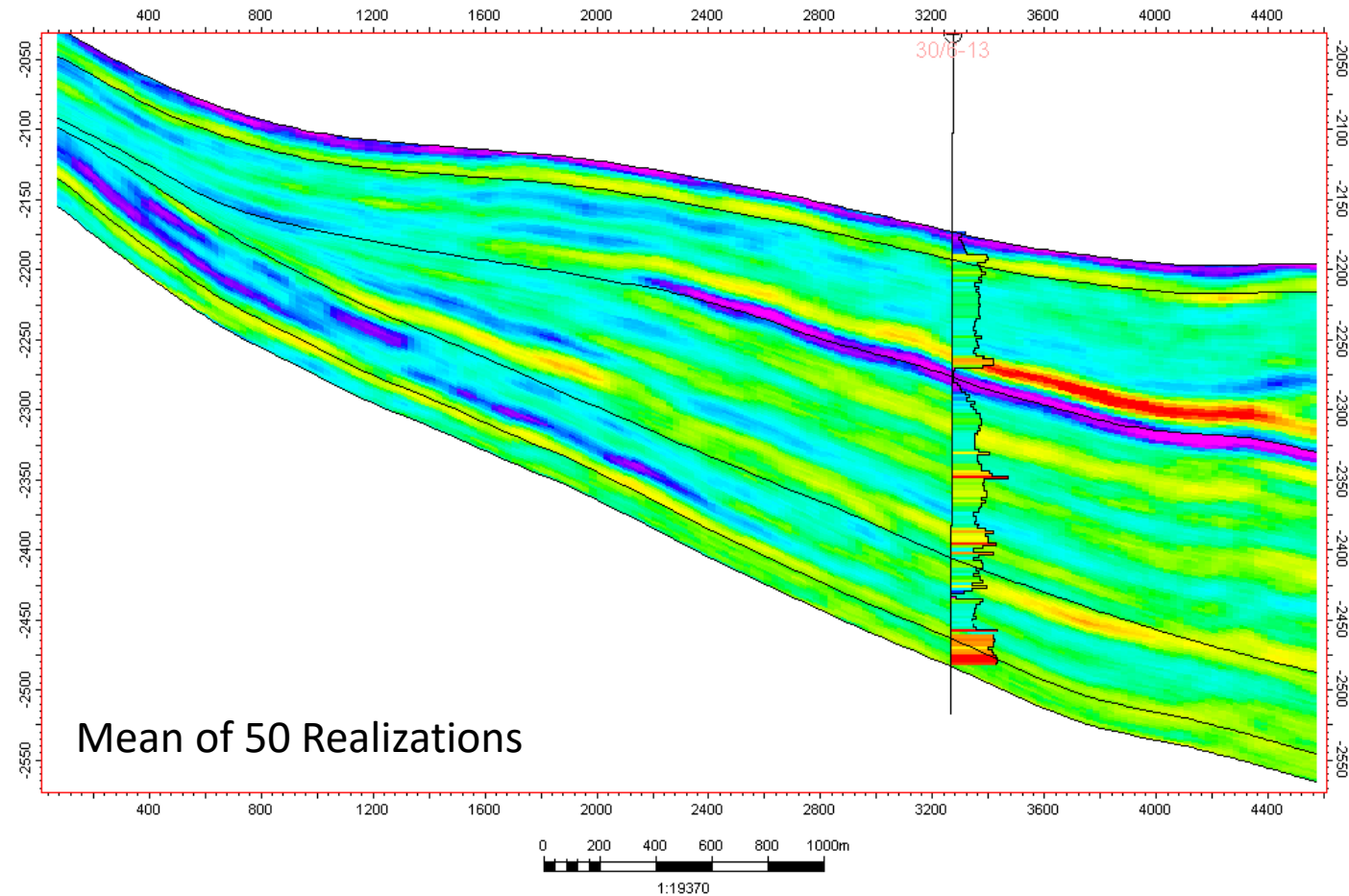
# Stochastic-Deterministic Comparison



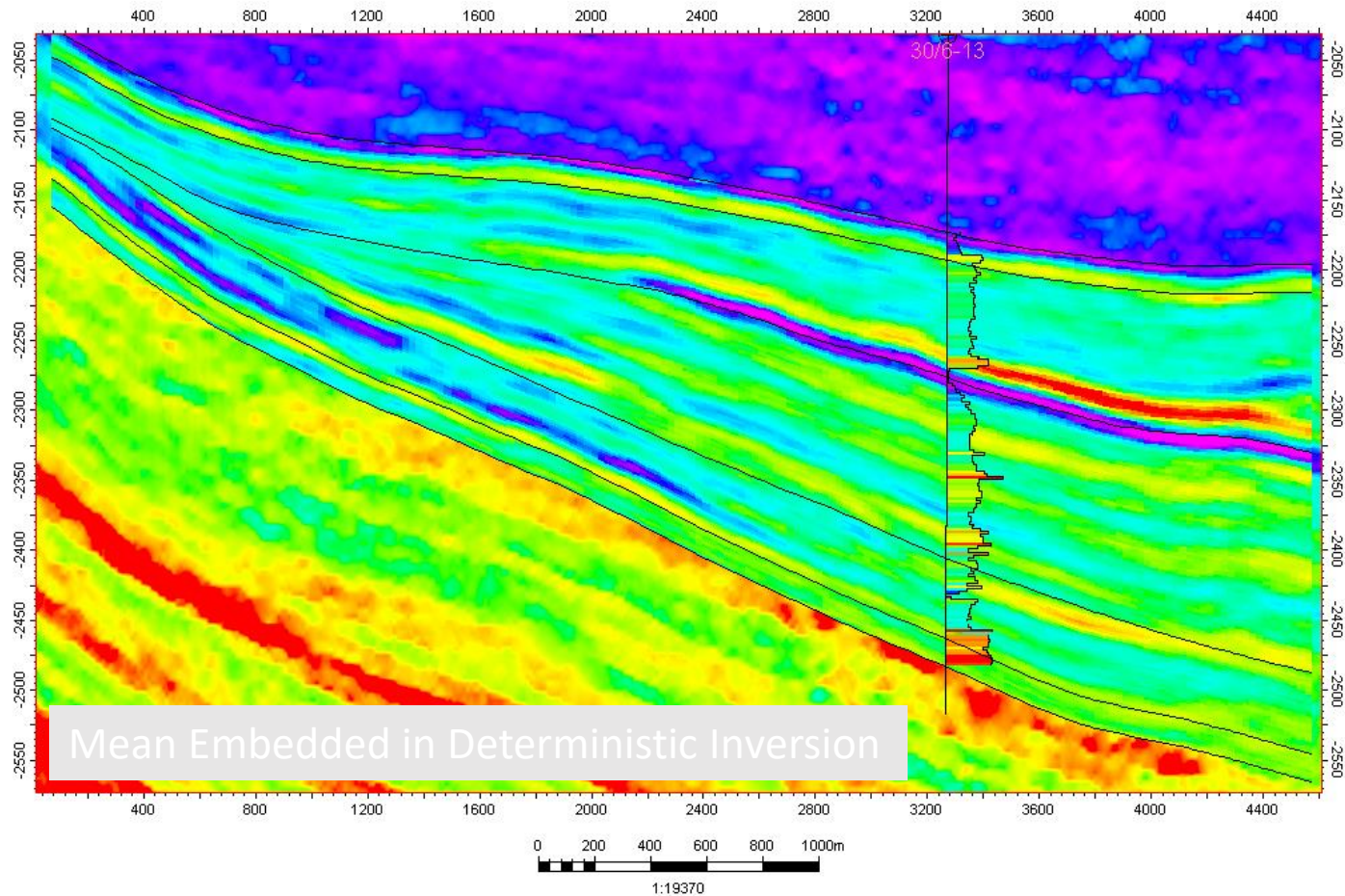
# Stochastic-Deterministic Comparison



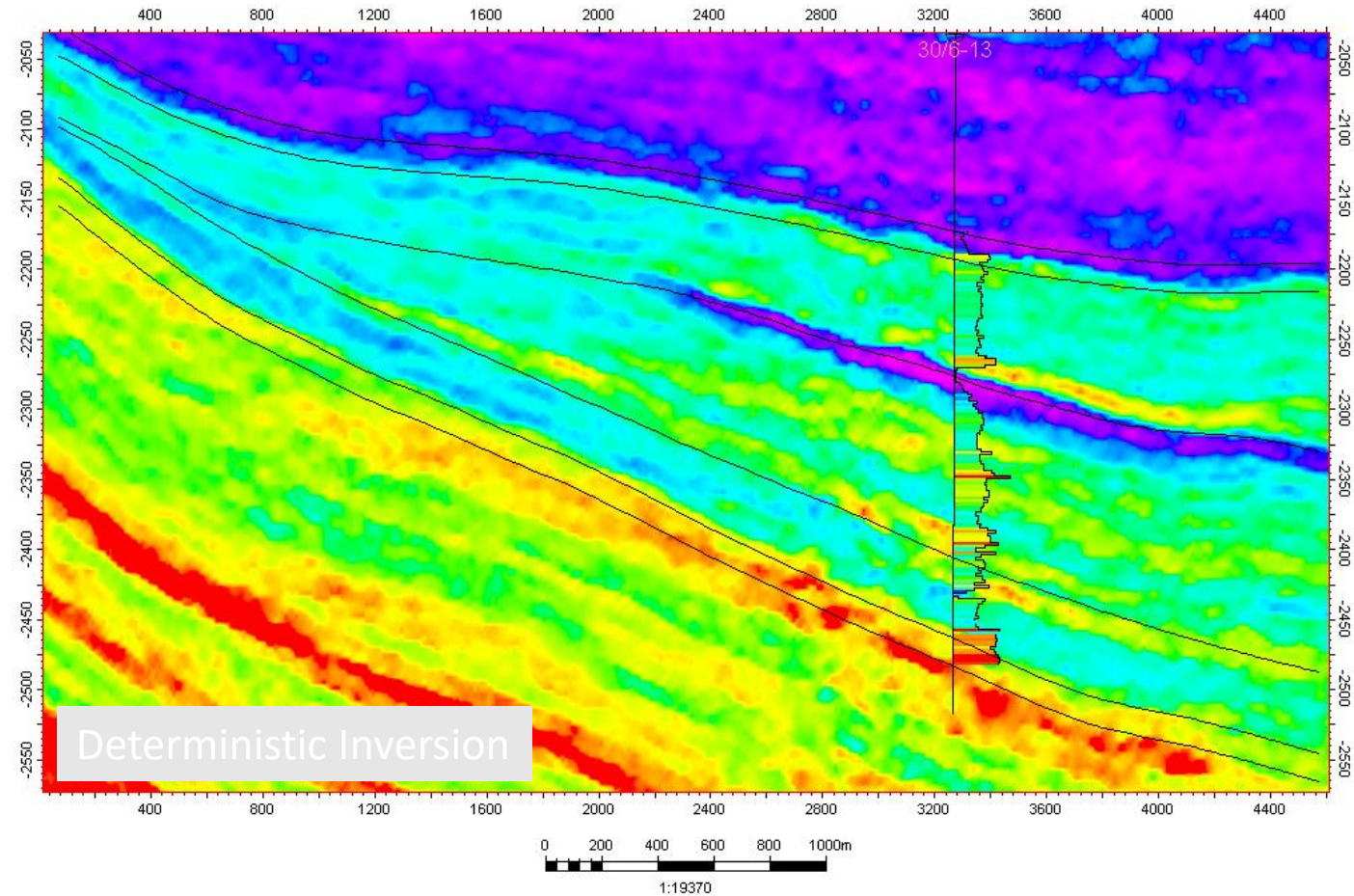
# Cross-Section – 30/6-13



# Cross-Section – 30/6-13



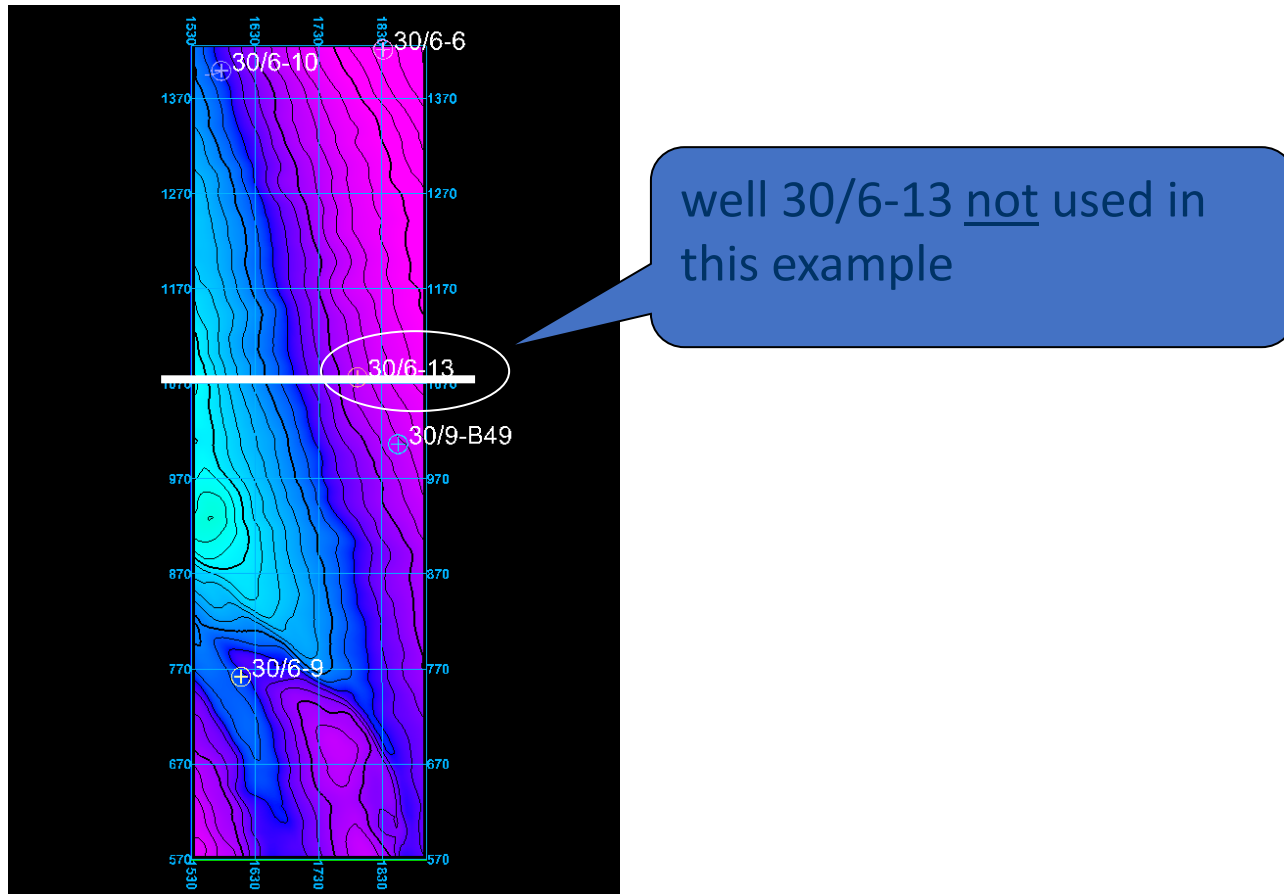
# Cross-Section – 30/6-13



# Section 5.

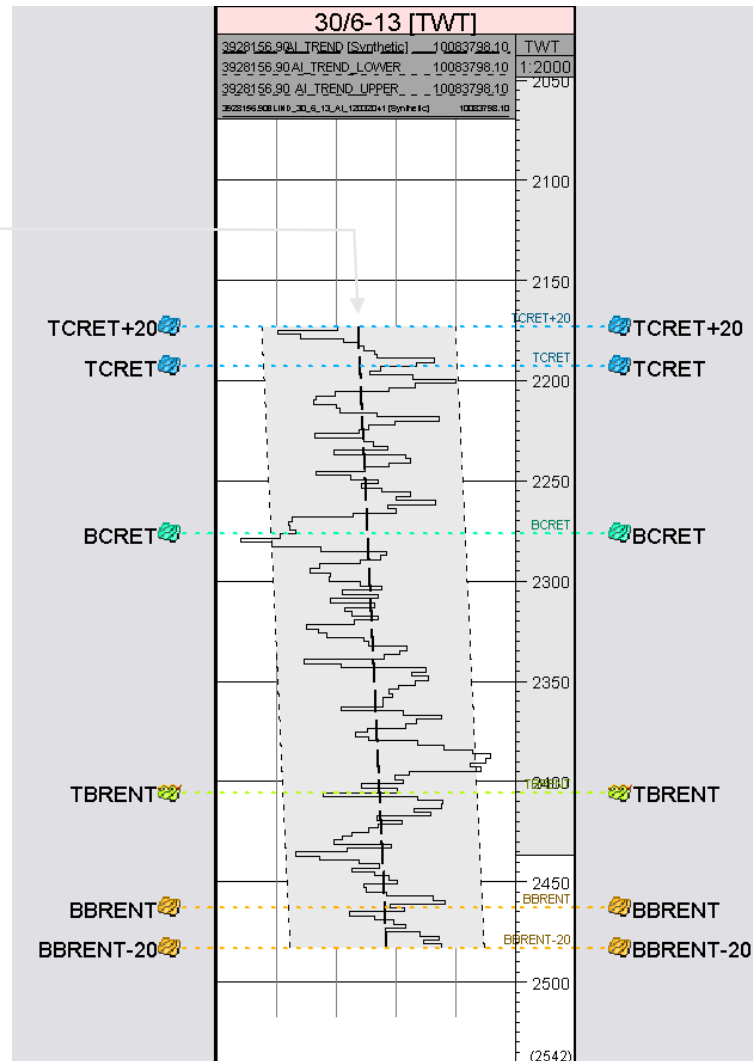
## Validating stochastic inversion at blind wells

# Blind Well Validation



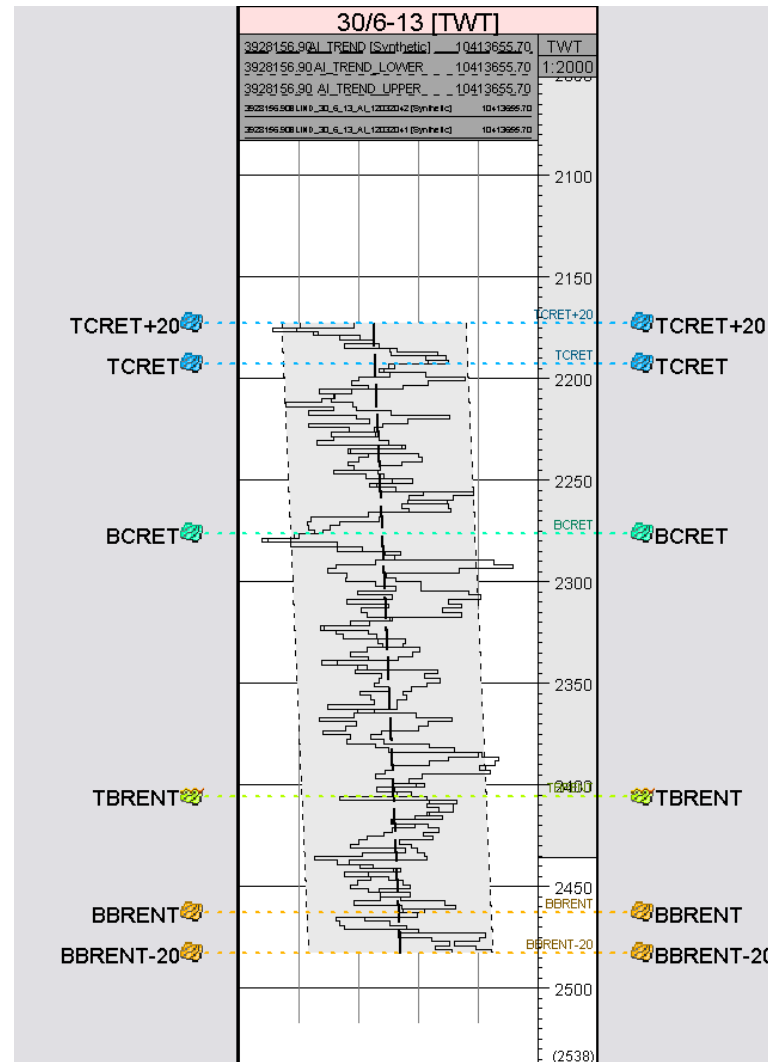
# Blind Well Validation – 30/6-13

Slight, constant  
background trend

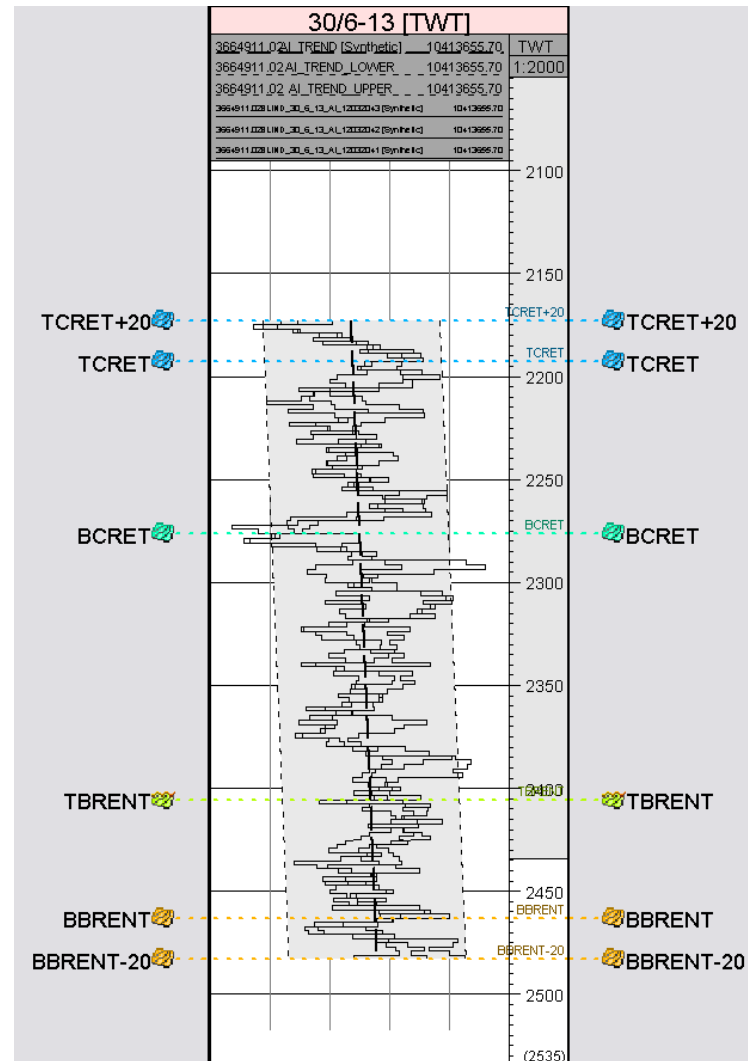


Single realization  
plotted

# Blind Well Validation – 30/6-13

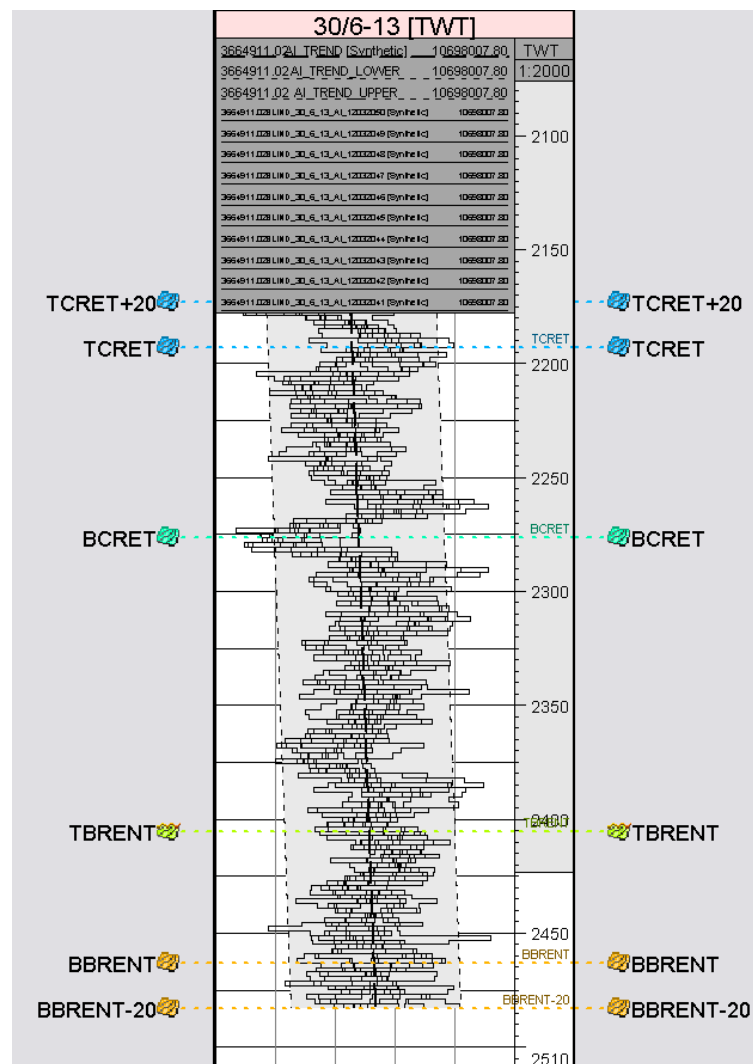


# Blind Well Validation – 30/6-13



Three realizations  
plotted

# Blind Well Validation – 30/6-13



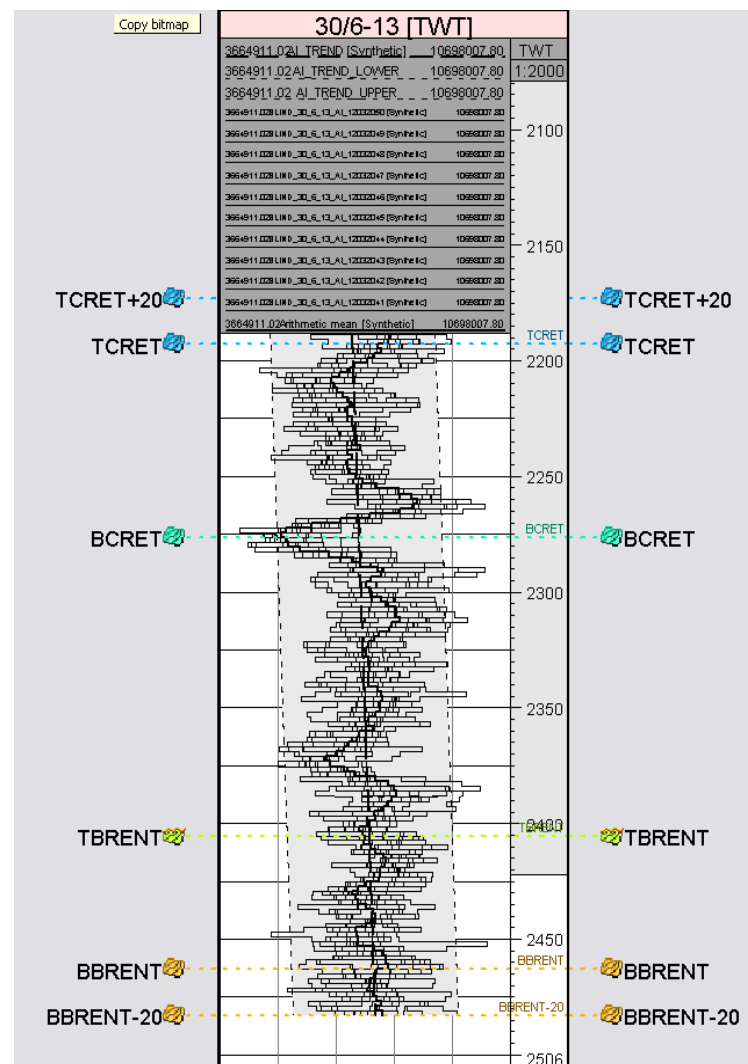
Ten realizations plotted

All realizations different  
but overall trend similar

All match input data  
within defined limits

~95% of predicted  
points lie within  $\pm 2 \times$   
std dev.

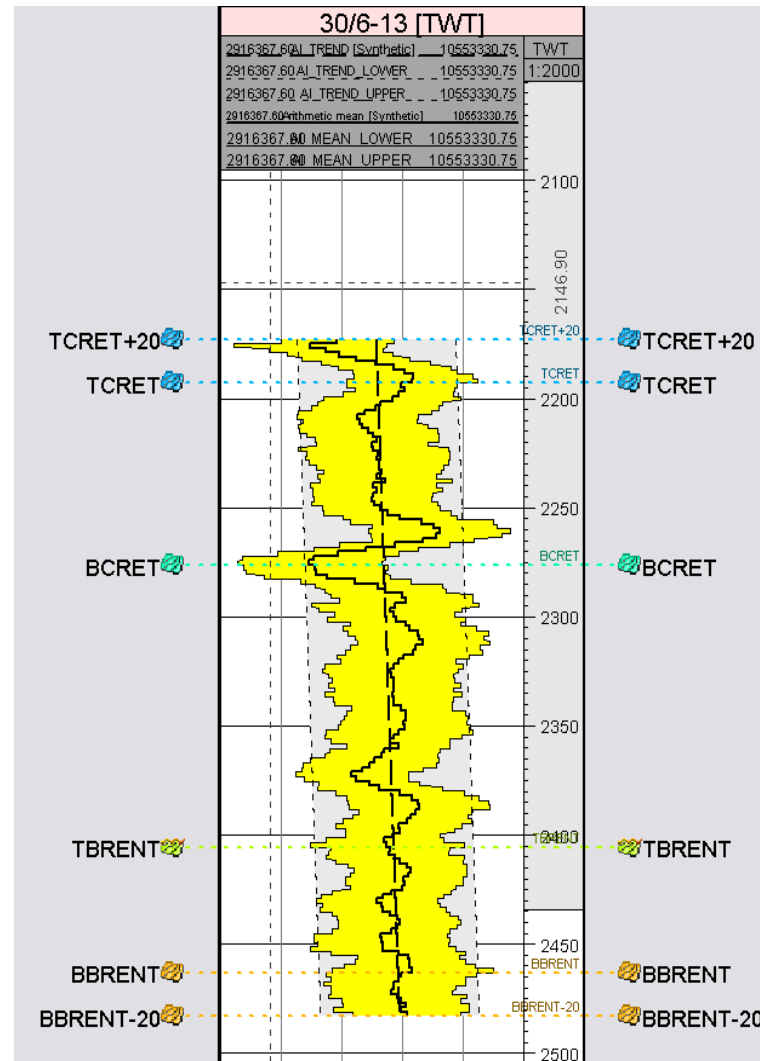
# Blind Well Validation – 30/6-13



**Bold black curve = mean  
of all realizations**

**Mean is smoother but  
still shows overall  
“character” of geology**

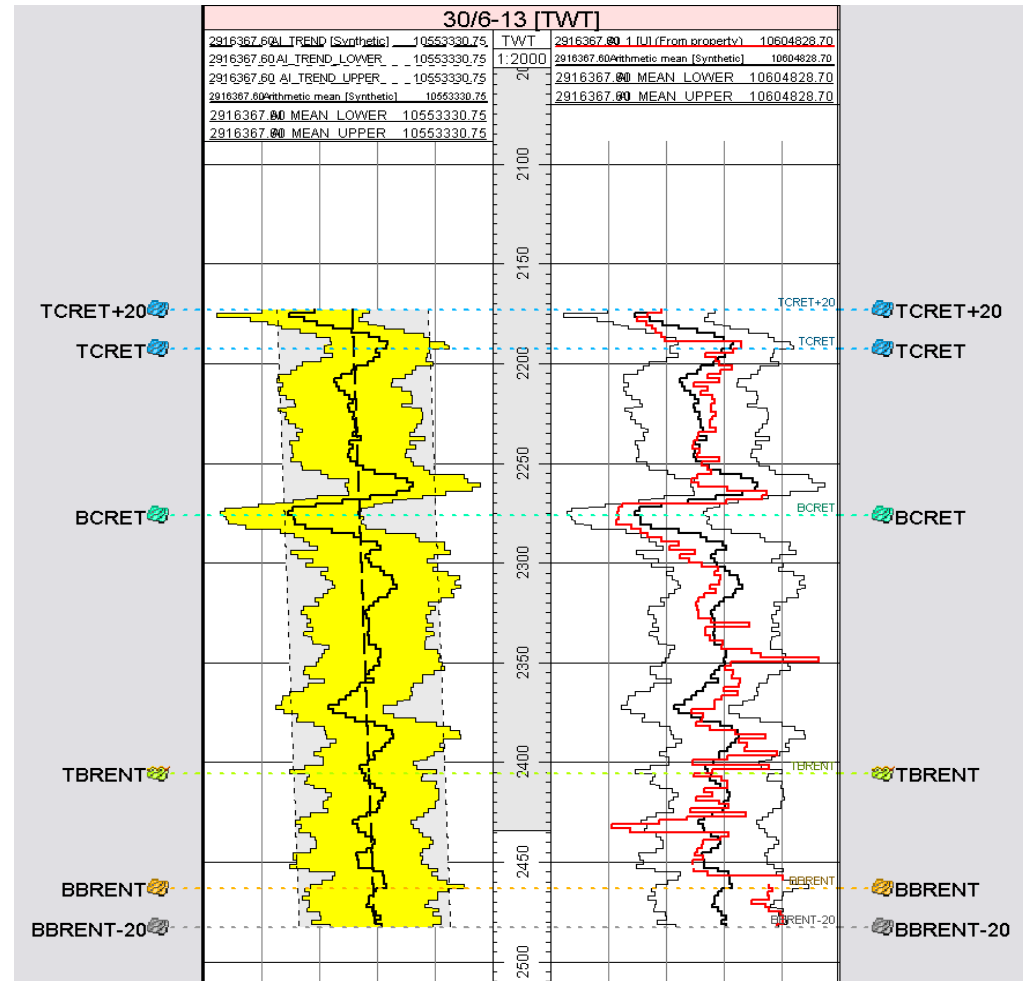
# Blind Well Validation – 30/6-13



**Bold black curve = mean  
of all realizations**

**Yellow = upper & lower  
limits of all realizations**

# Blind Well Validation – 30/6-13



## Key to R.H.Log Panel

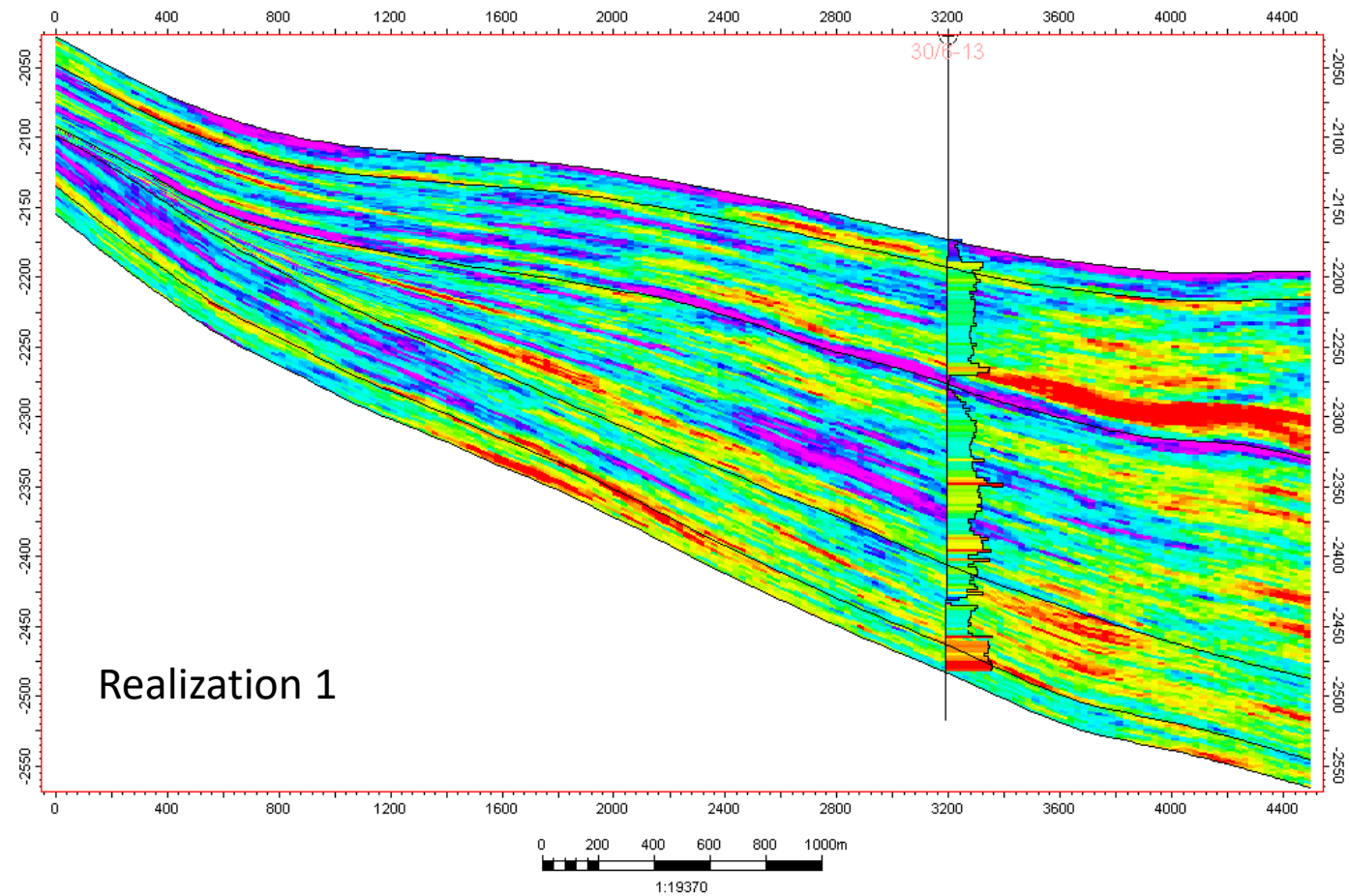
- Actual AI from well
- Mean of all realizations
- +/- 2 x std deviations

- Mean is smoothed but still shows close tie to actual well results

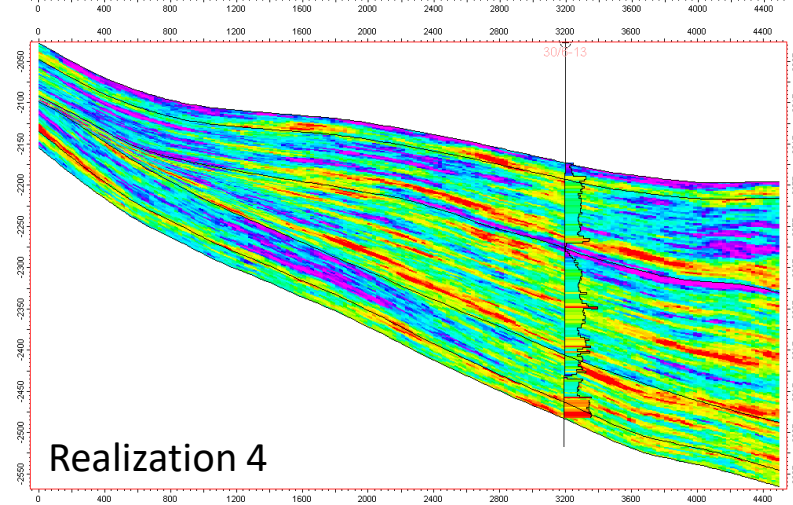
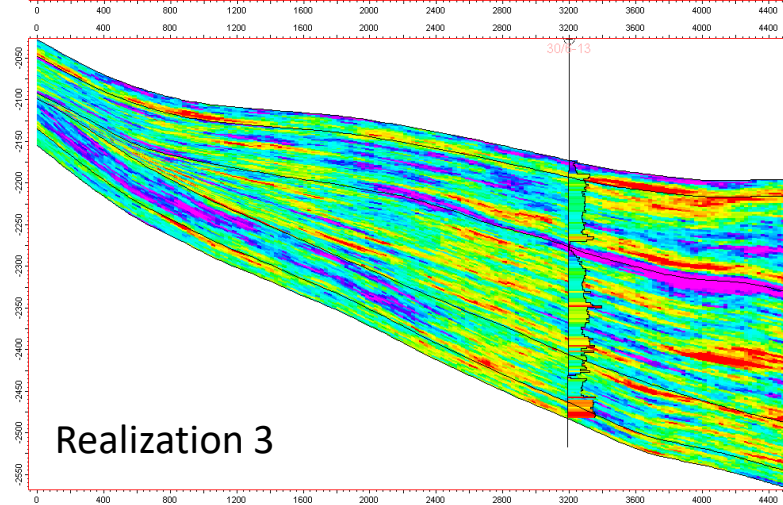
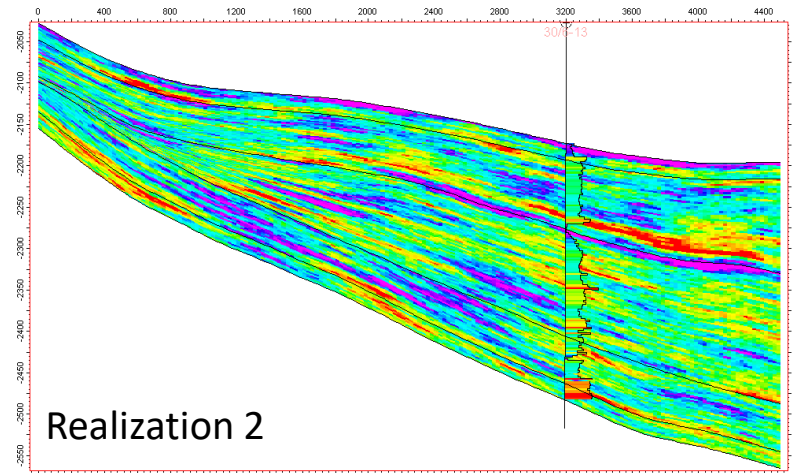
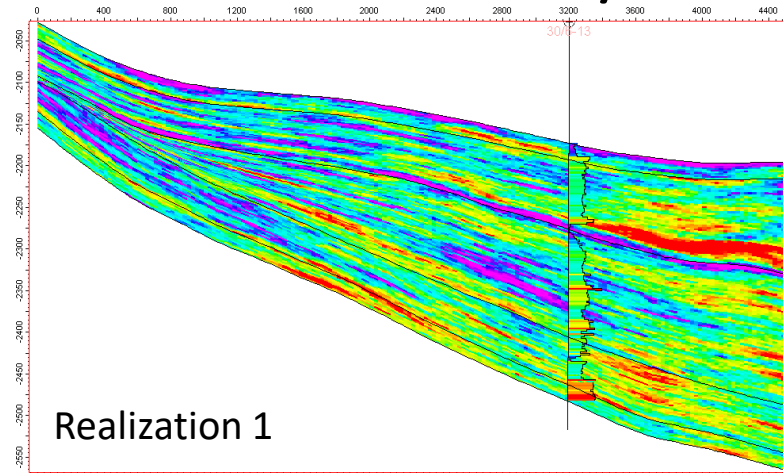
- Realizations cover 95+% of actual log results even though well not used in this example

- Demonstrates predictive power of the realizations

# Cross-Section – 30/6-13



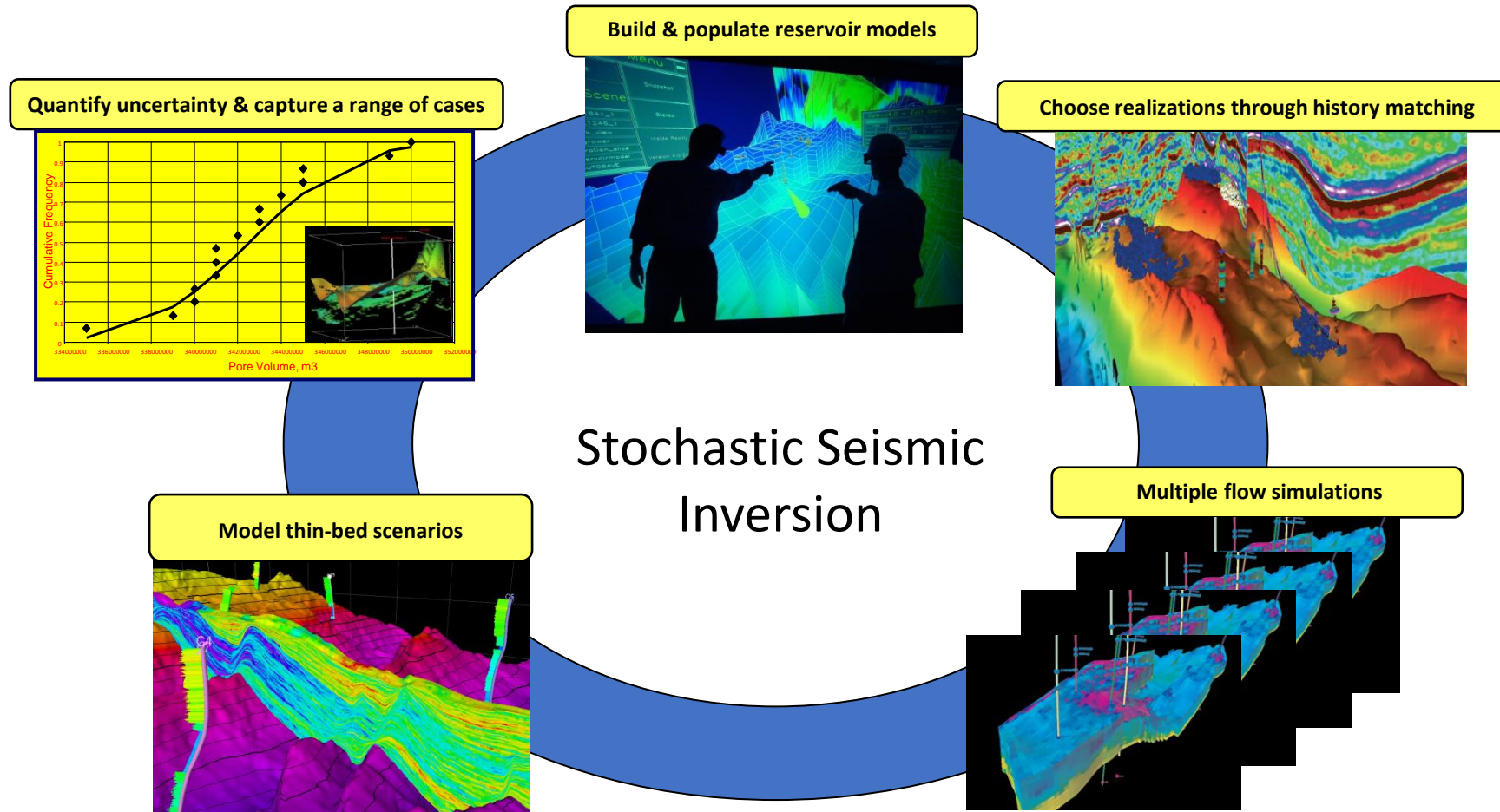
# Cross-Section – 30/6-13



# Section 6.

## Stochastic inversion in seismic-to-simulation workflows

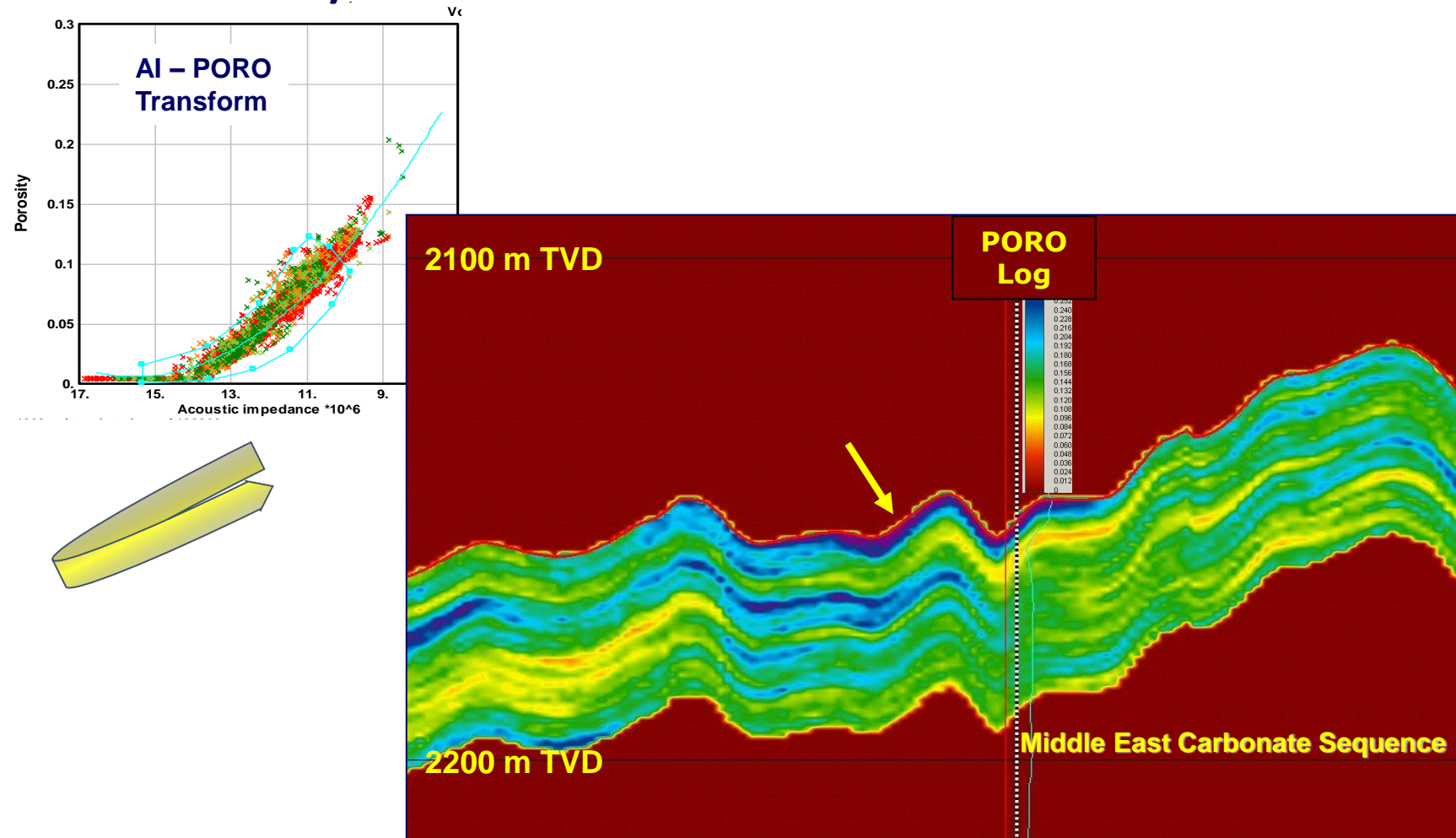
# Exploiting Stochastic Inversion



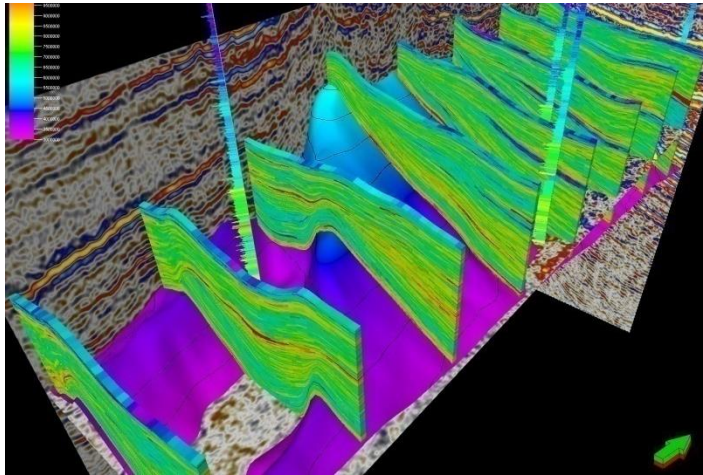
# Exploiting Stochastic Inversion

- Exploitation of stochastic inversion results:
  - Petrophysical property modelling
  - Volumetrics
  - Dynamic flow simulation (streamlines)
  - Well planning
  - Well connectivity
  - Connected volumes

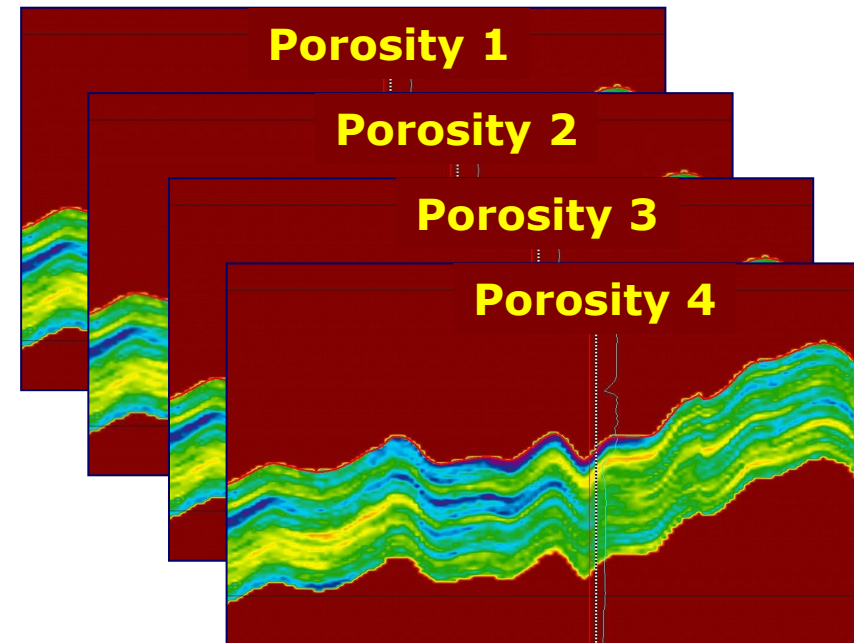
# Transform Impedance Volumes to Porosity



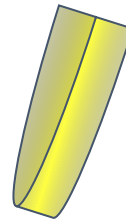
# Create Multiple Pore Volume Realizations



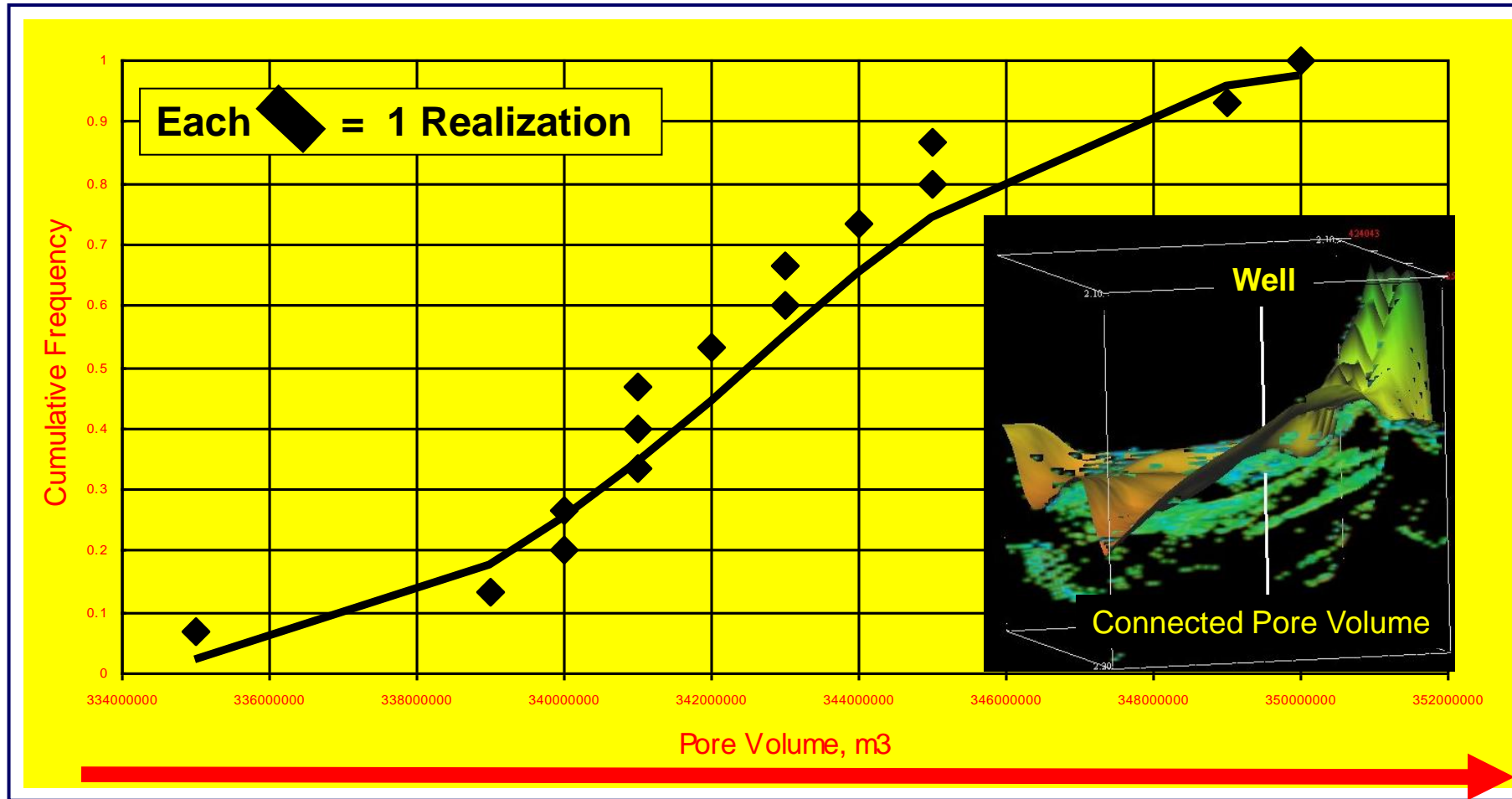
Hi-Res, Equiprobable  
Stochastic Simulations



Depth Volumes

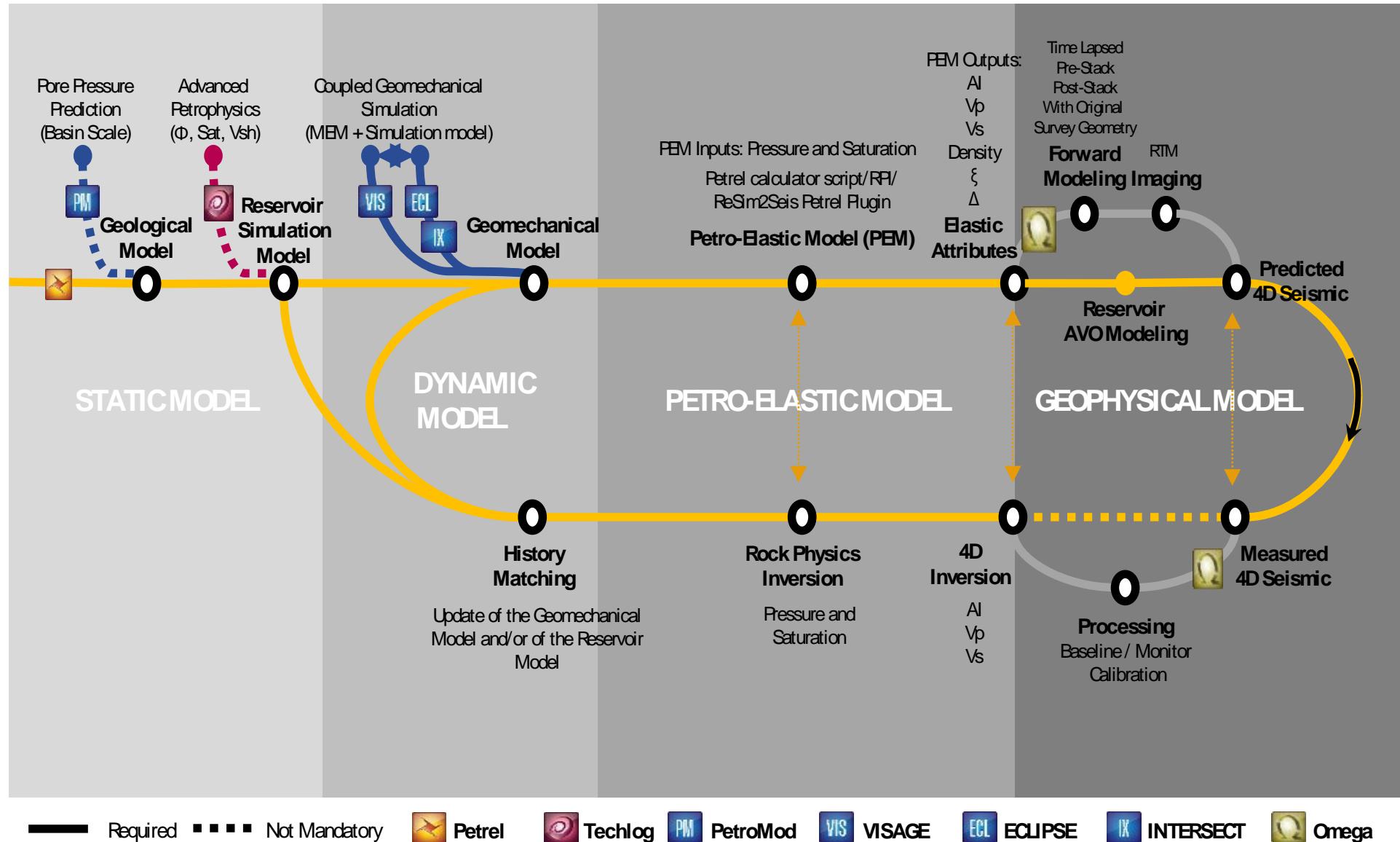


# Rank models for P10, P50, P90 etc

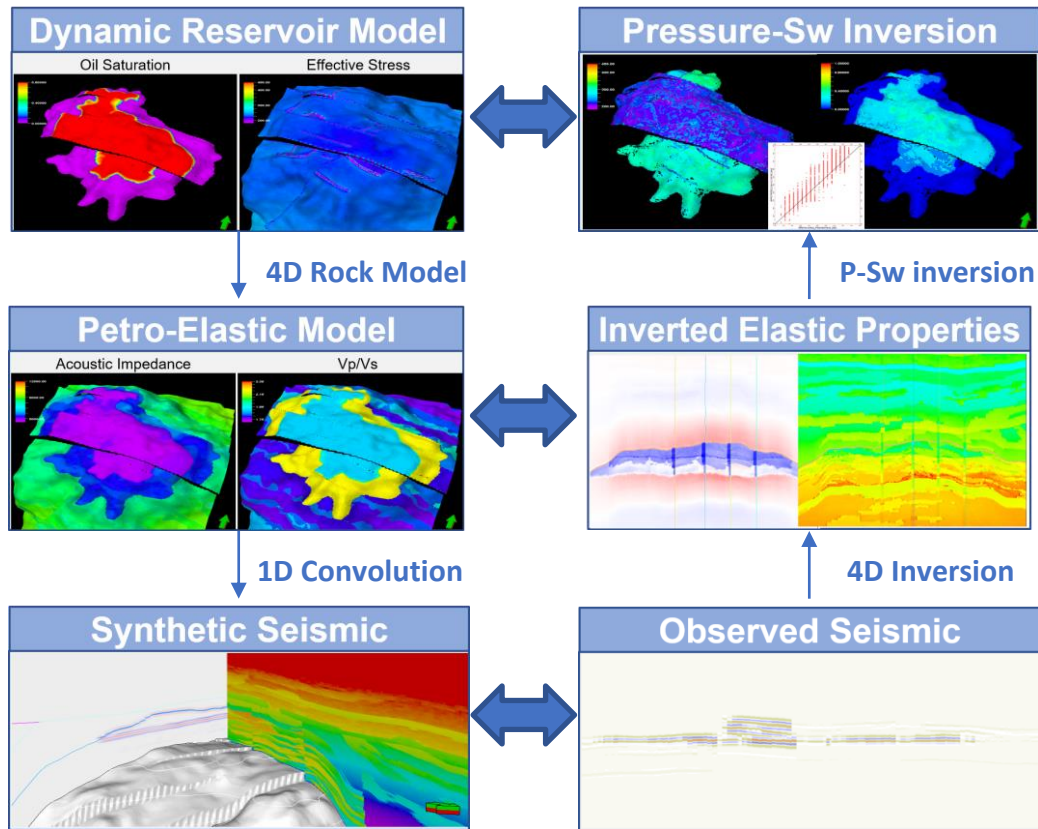


# 4D Interpretation Strategies

# Closed-Loop Seismic Reservoir Monitoring



# 4D Interpretation strategies | From qualitative to quantitative



At which level should the matching be attempted?

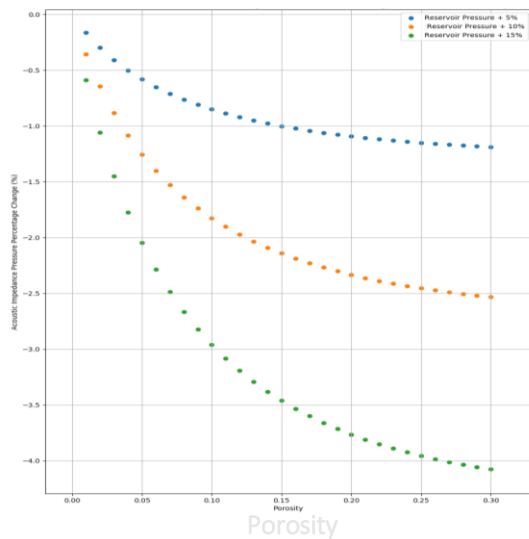
- seismic amplitudes
- elastic properties
- petrophysical properties

Driven by sensitivity analysis of the 4D rock model

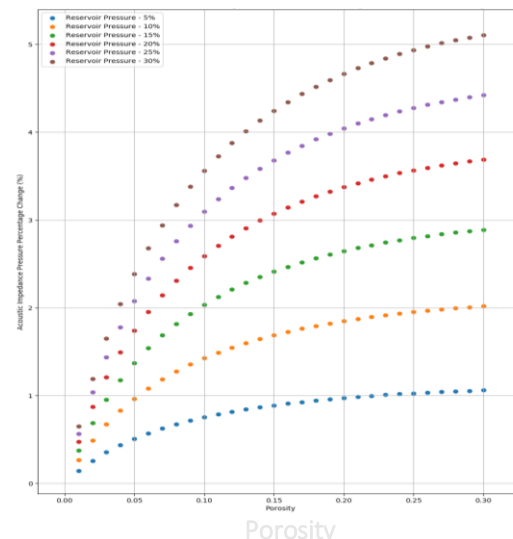
- Upfront testing to streamline the seismic history matching process when data becomes available

# Rock model sensitivity analysis

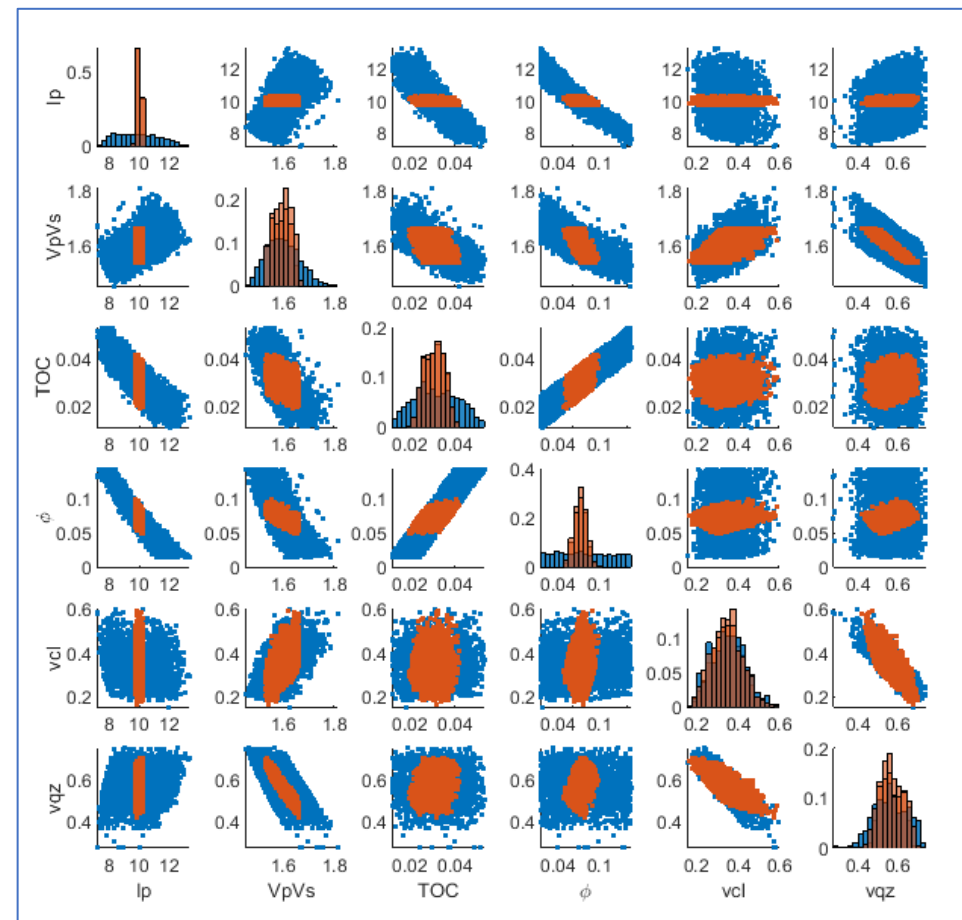
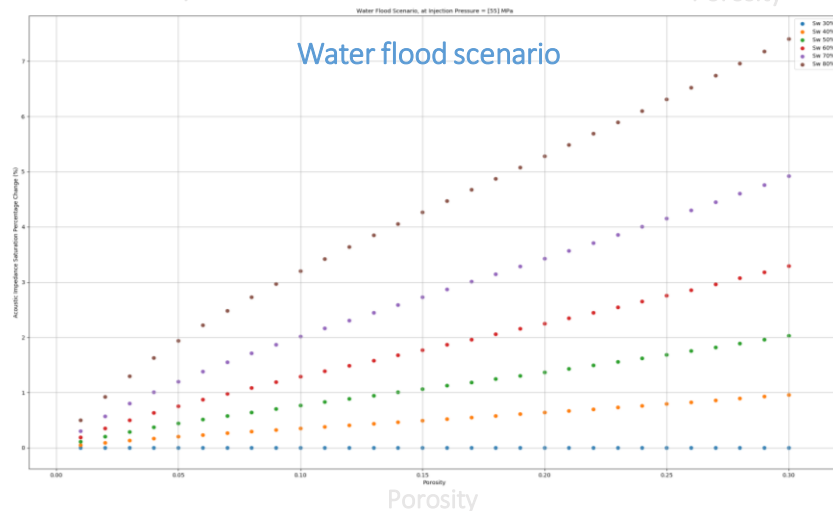
Pressure increase scenario



Depletion scenario

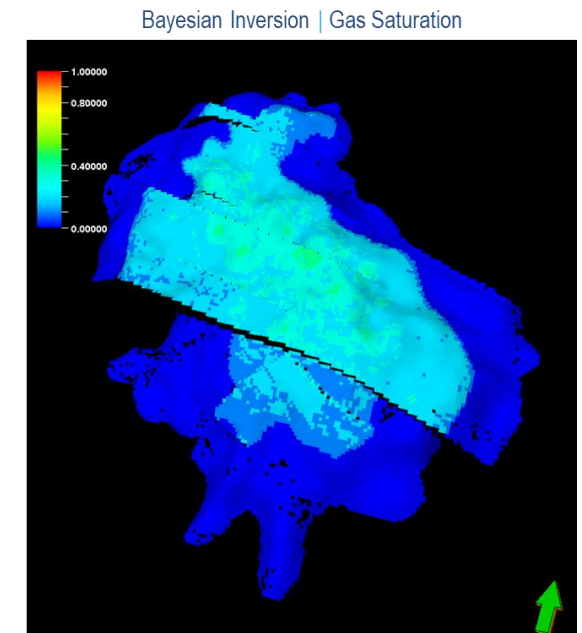
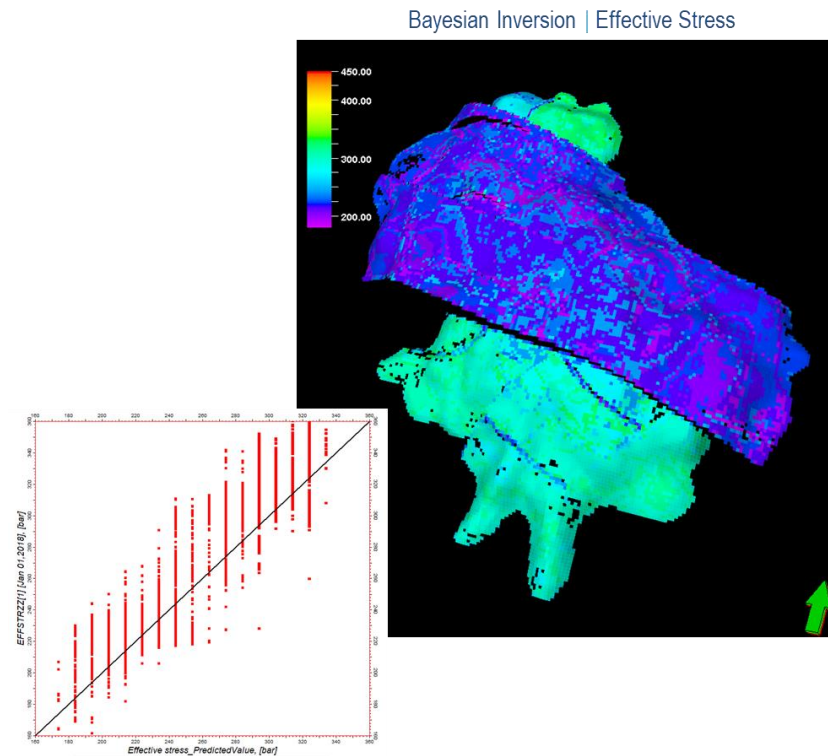
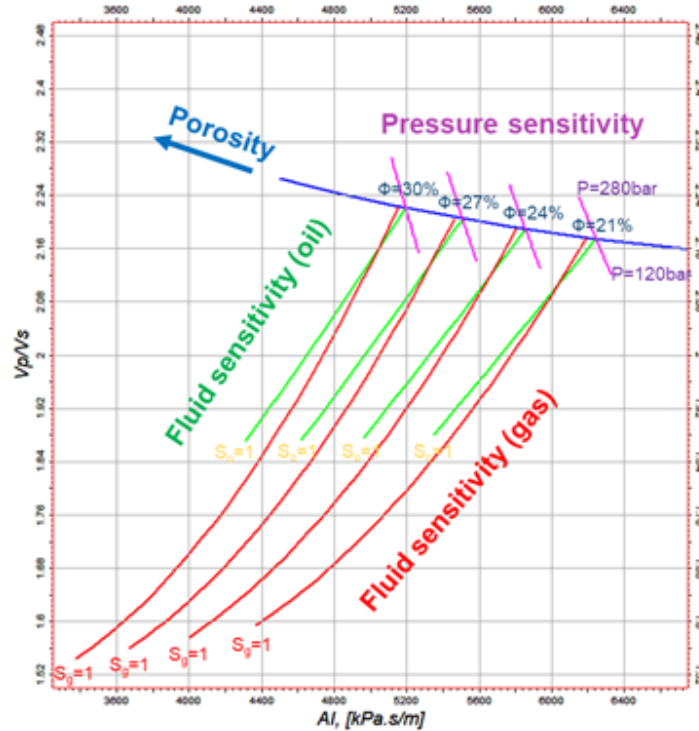


Water flood scenario

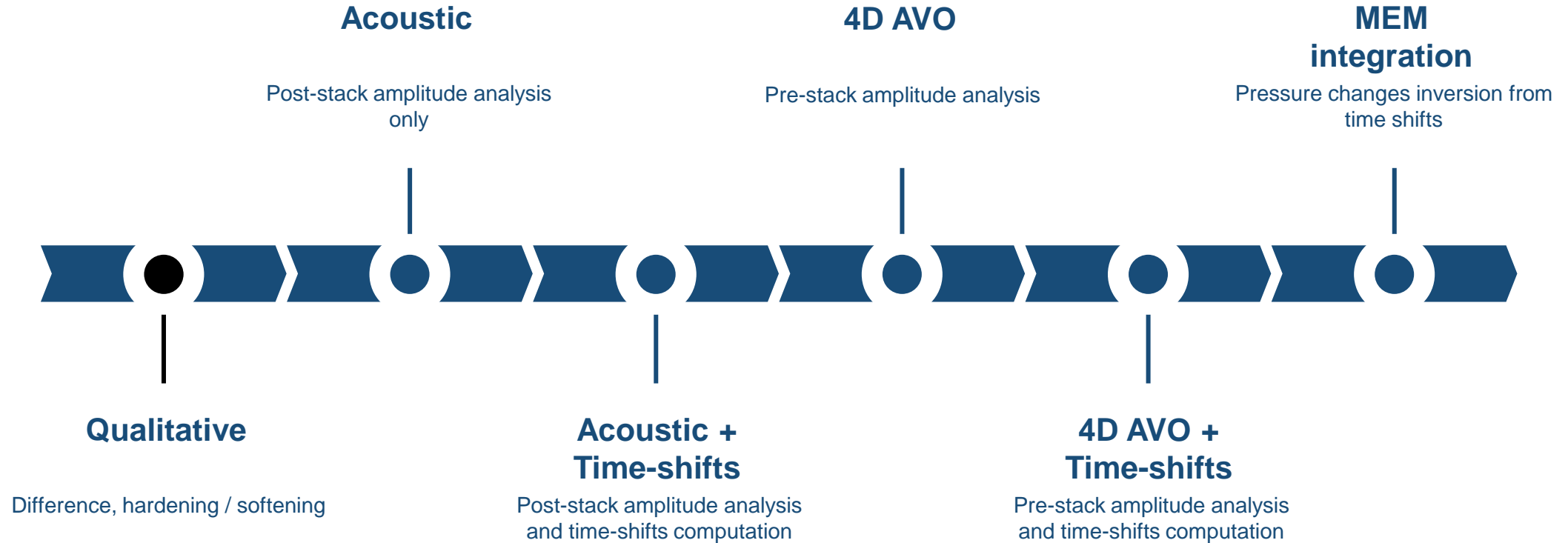


# Rock model sensitivity analysis | P-Sw inversion

- Pressure-Saturation inversion can be seen as a tool to understand sensitivity and our ability to recover and discriminate information even in absence of noise



# Increasing complexity (and effort) of analysis



Note: seismic data quality matters...

# Case study | South Arne

# Applying time-lapse seismic to reservoir management and field development planning at South Arne, Danish North Sea

J.V. Herwanger<sup>1</sup>, C.R. Schiøtt<sup>2</sup>, R. Frederiksen<sup>2</sup>, F. If<sup>2</sup>, O.V. Vejbæk<sup>2</sup>, R. Wold<sup>3</sup>, H.J. Hansen<sup>4</sup>, E. Palmer<sup>5</sup>, N. Koutsabeloulis<sup>6</sup>

<sup>1</sup> Schlumberger-WesternGeco, 10001 Richmond Avenue, Houston, TX, 77042, U.S.A.

<sup>2</sup> Hess, Østergade 26B, 1100 Copenhagen, Denmark

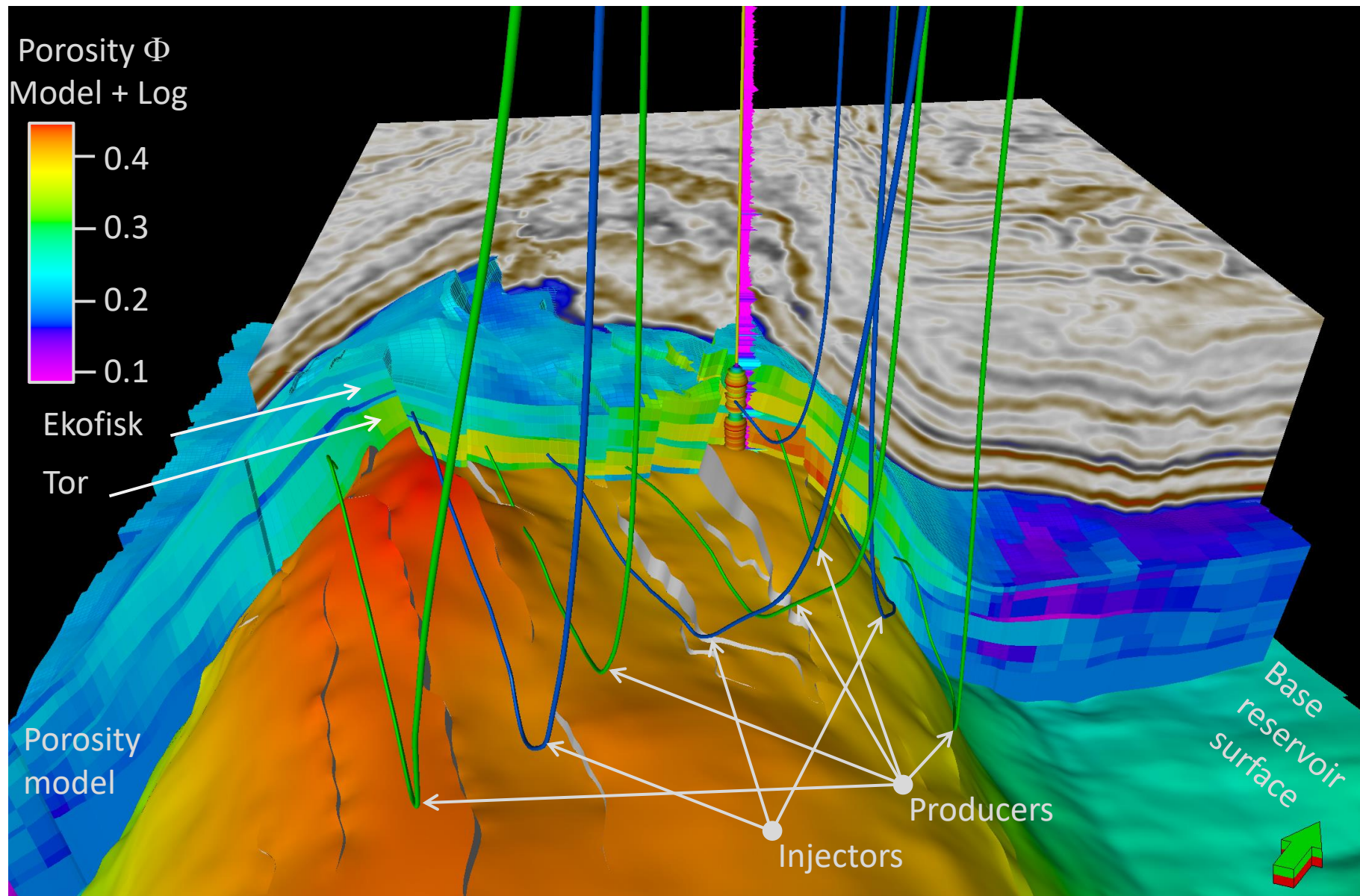
<sup>3</sup> Schlumberger Information Solutions, 1325 South Dairy Ashford, Houston, TX, 77077, U.S.A

<sup>4</sup> Schlumberger Reservoir Seismic Services, Titangade 15, 2200 Copenhagen, Denmark

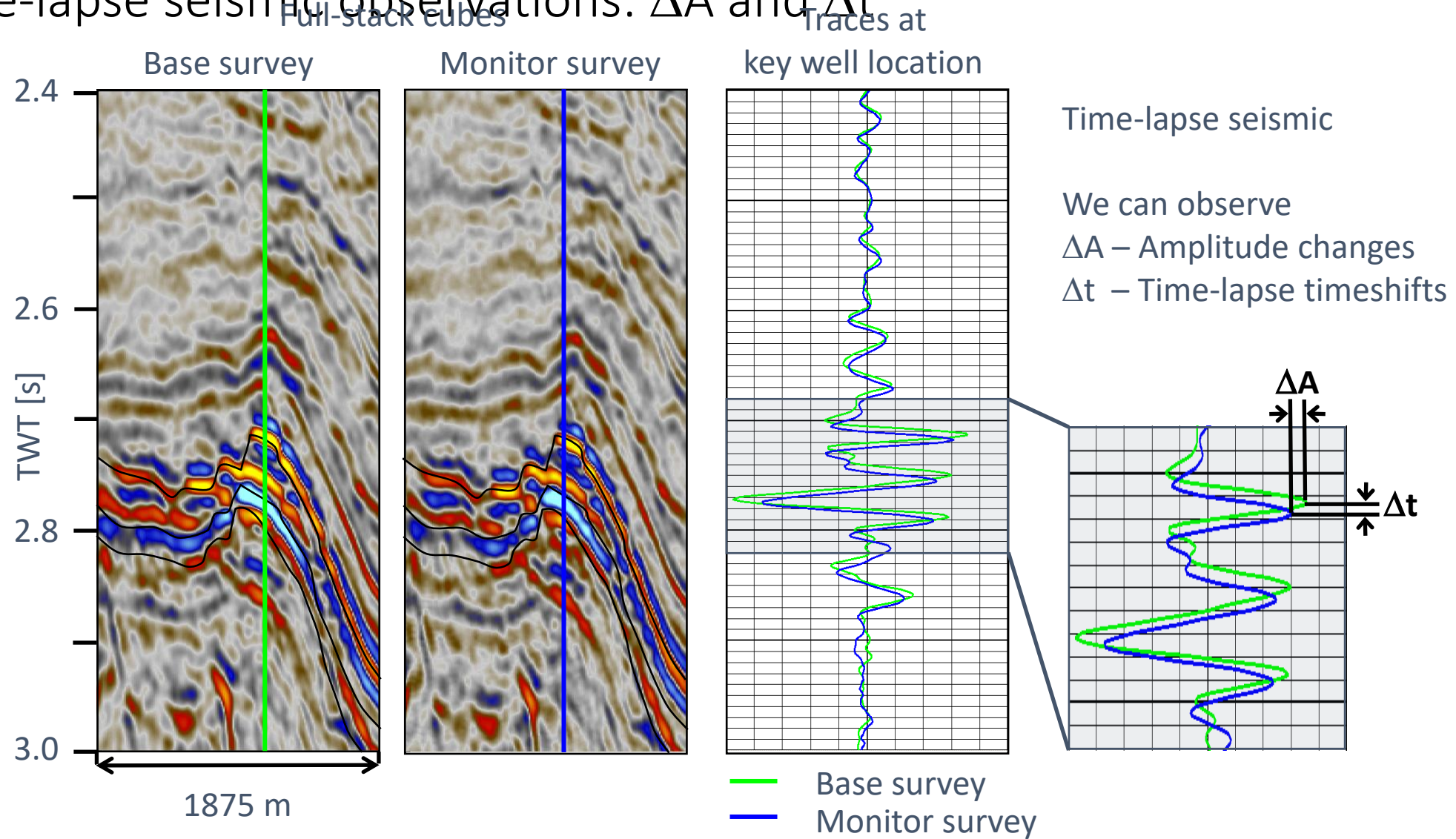
<sup>5</sup> Schlumberger-WesternGeco, Schlumberger House, Buckingham Gate, Gatwick Airport, Gatwick, RH6 0NZ, GB

<sup>6</sup> Schlumberger Reservoir Geomechanics Centre of Excellence, 10 The Courtyard, Eastern Road, Bracknell, RG12 2XB, GB

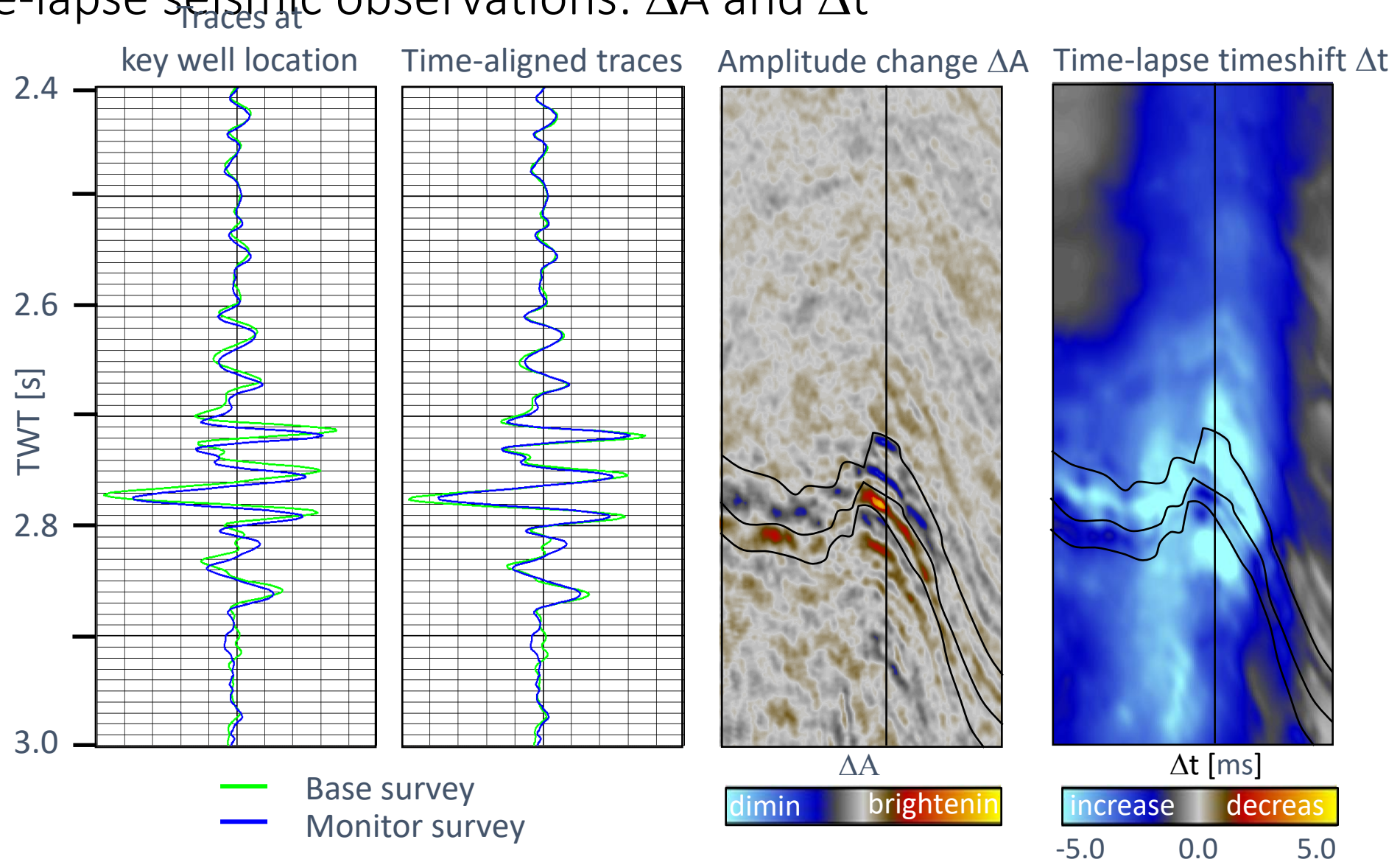
# South Arne reservoir description



# Time-lapse seismic observations: $\Delta A$ and $\Delta t$



# Time-lapse seismic observations: $\Delta A$ and $\Delta t$



# 4D Simultaneous Inversion

## Global optimization technique

Solves for elastic properties and their changes with a global optimization technique.

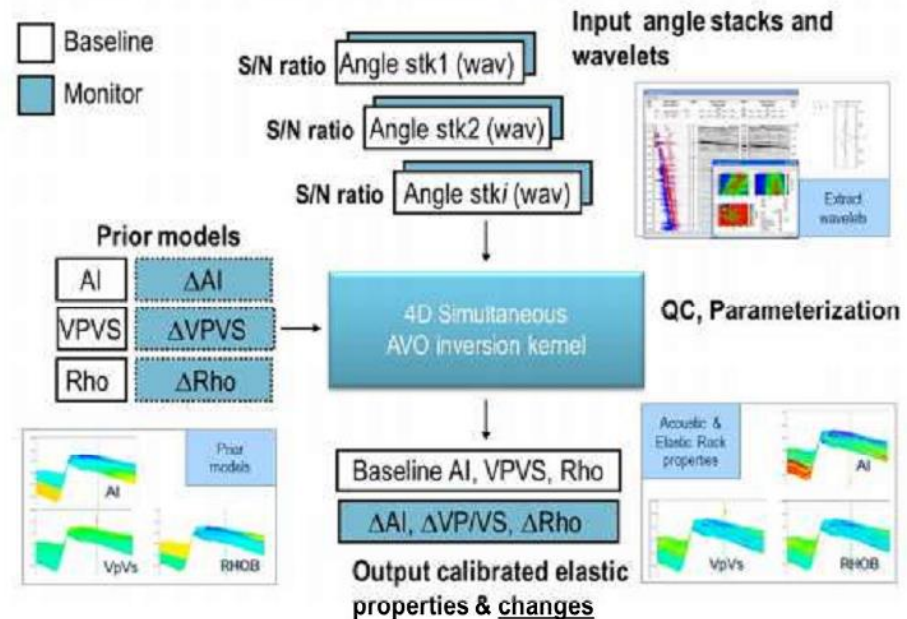
## Direct implementation of prior models

Low frequency models for different vintages using fluid substituted logs or  $\Delta VP/VP$  attributes derived from estimated time shifts.

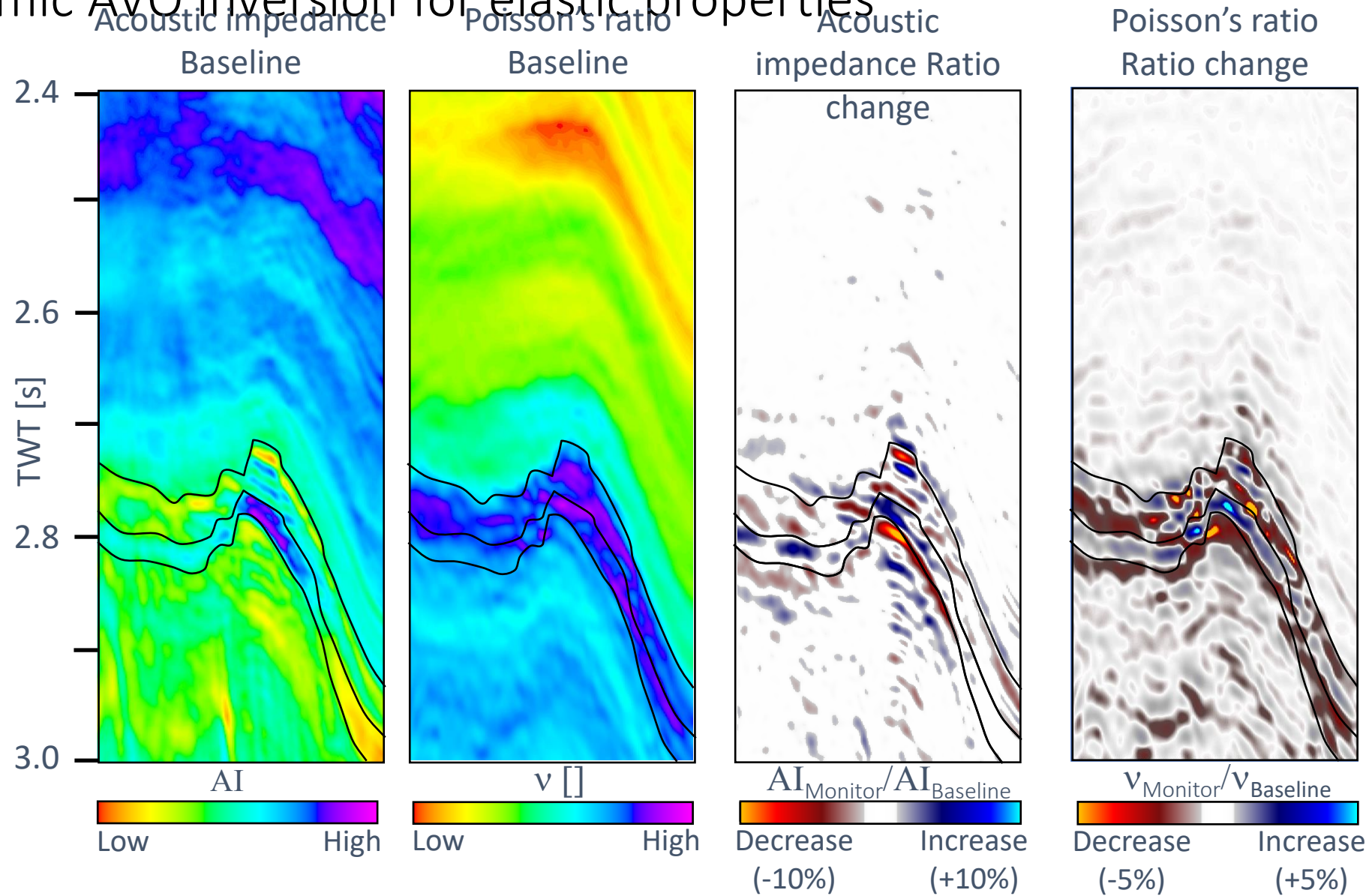
## Joint 4D saturation-pressure inversion

The changes in reservoir properties can be estimated by combining lithology analysis and the joint 4D saturation-pressure inversion workflow based on stochastic simulation of the 4D rock model defined.

## 4D Simultaneous AVO inversion workflow

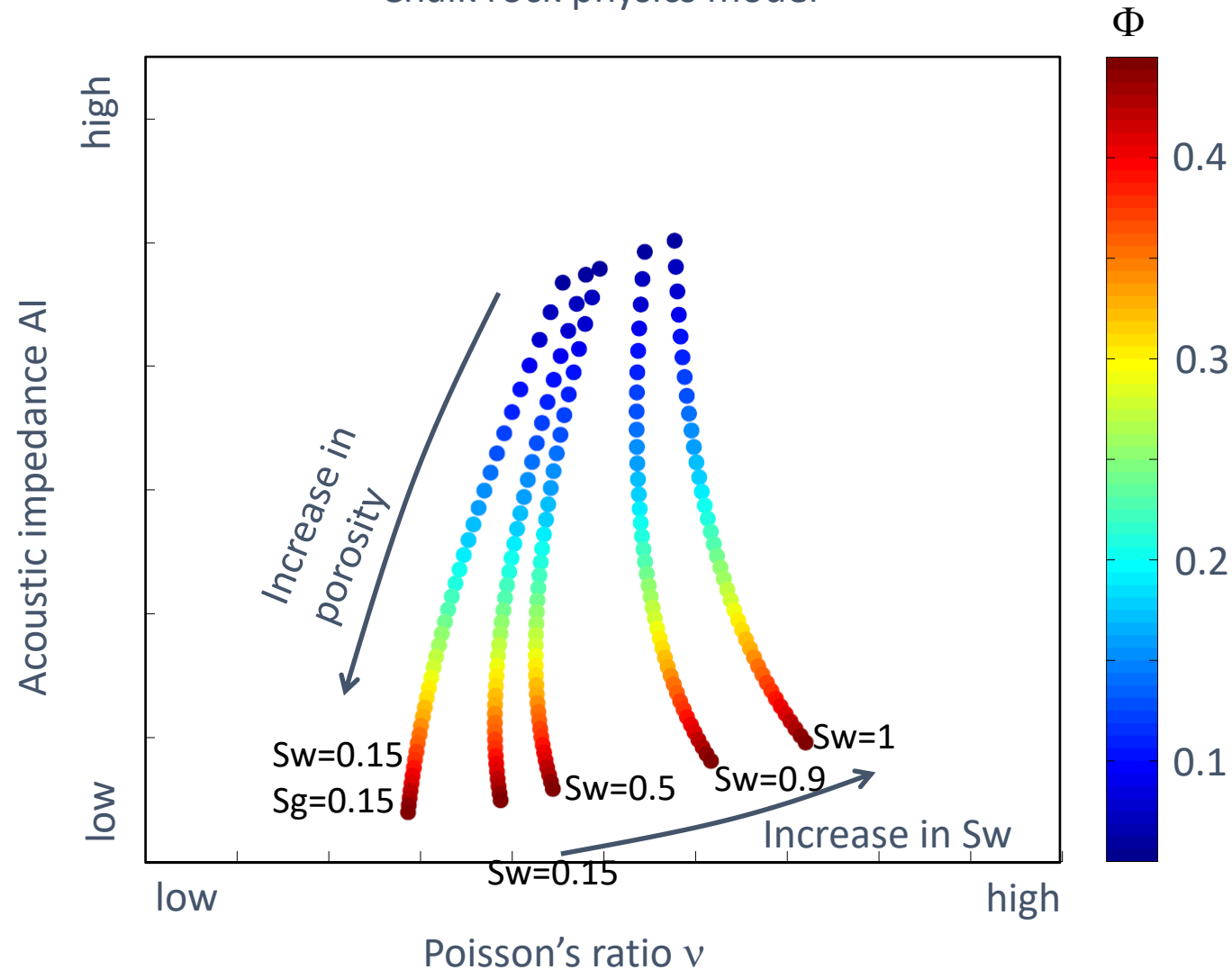


# Seismic AVO inversion for elastic properties



# Time-lapse rock-physics AVO inversion

Chalk rock physics model

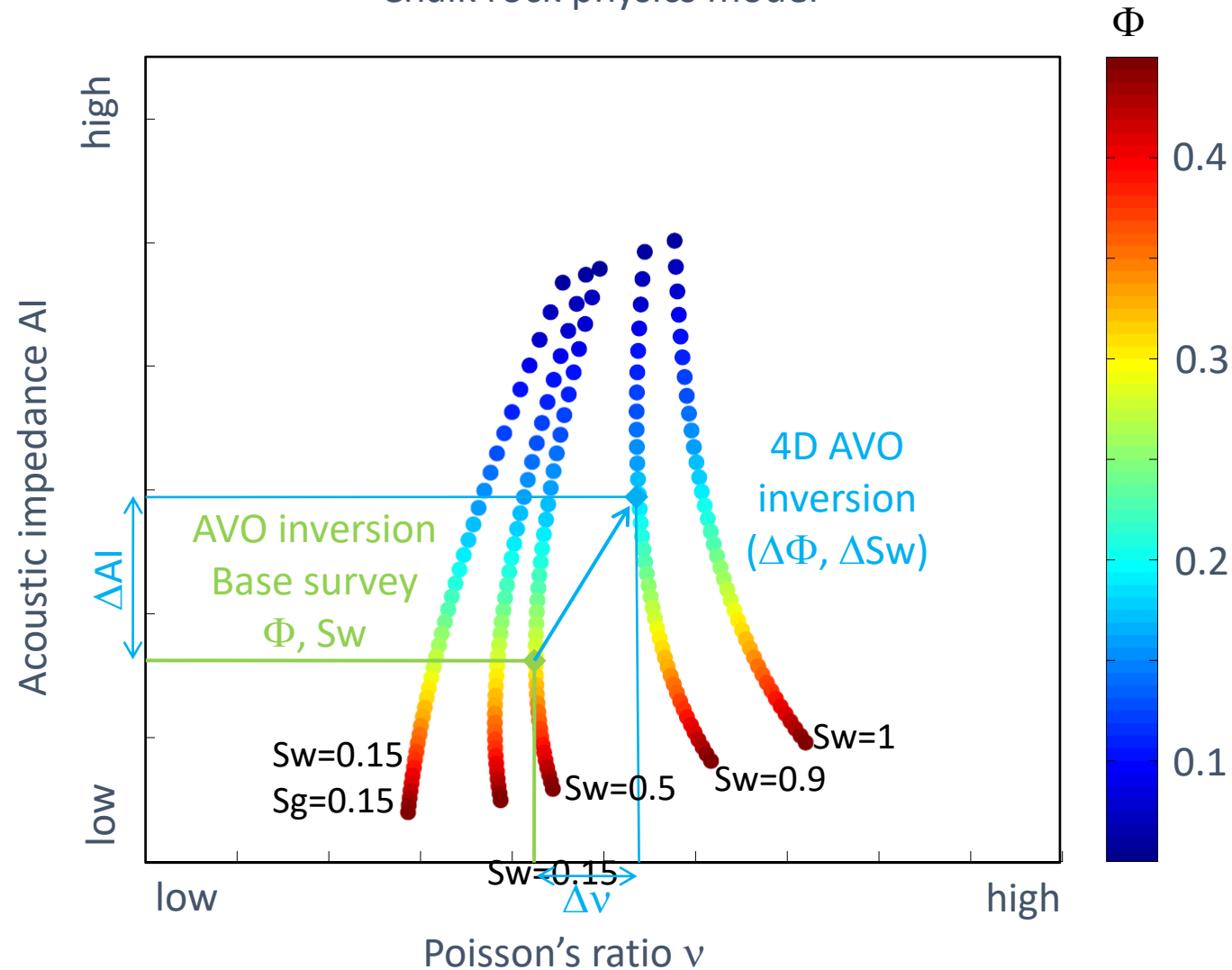


## Rock physics AVO inversion:

Translate elastic properties (Acoustic impedance AI and Poisson's ratio  $\nu$ ) to petrophysical properties (Porosity  $\Phi$  and Water saturation  $S_w$ ) by using a rock physics model

# Time-lapse rock-physics AVO inversion

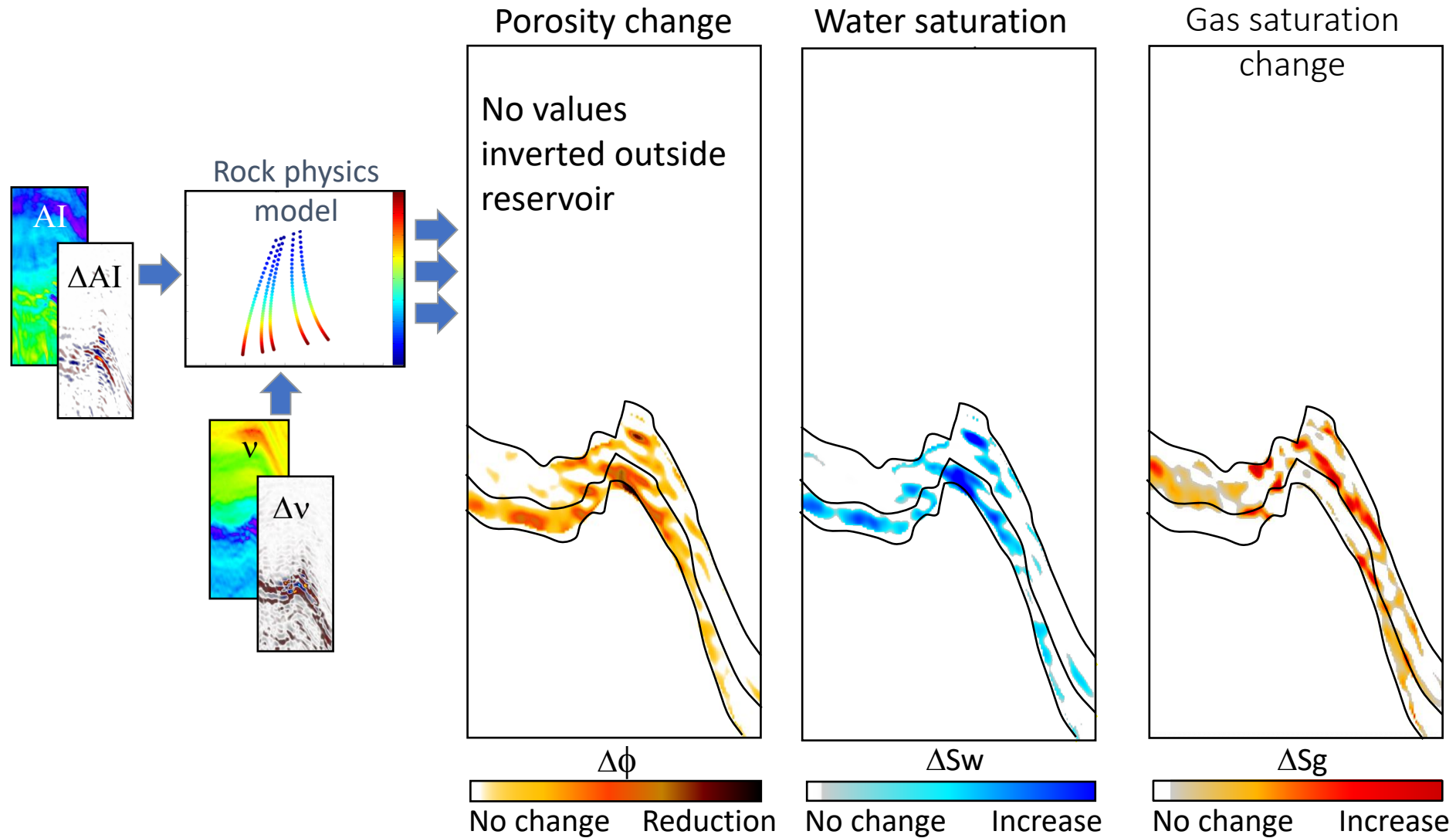
Chalk rock physics model



## Rock physics AVO inversion:

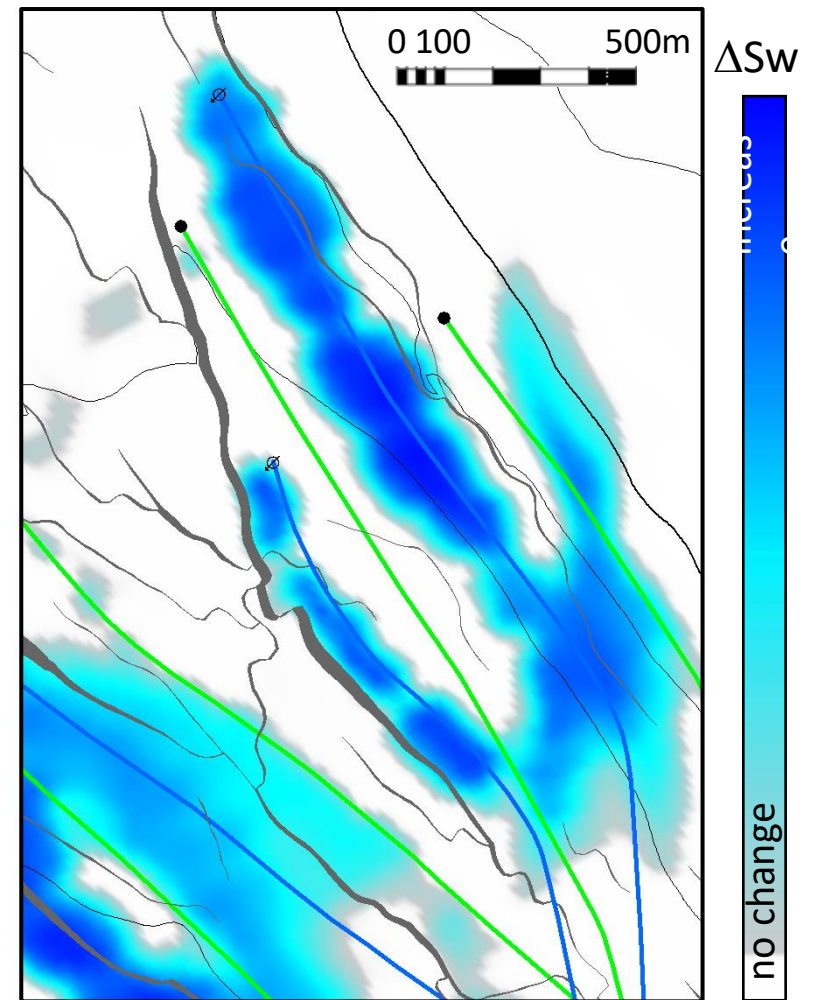
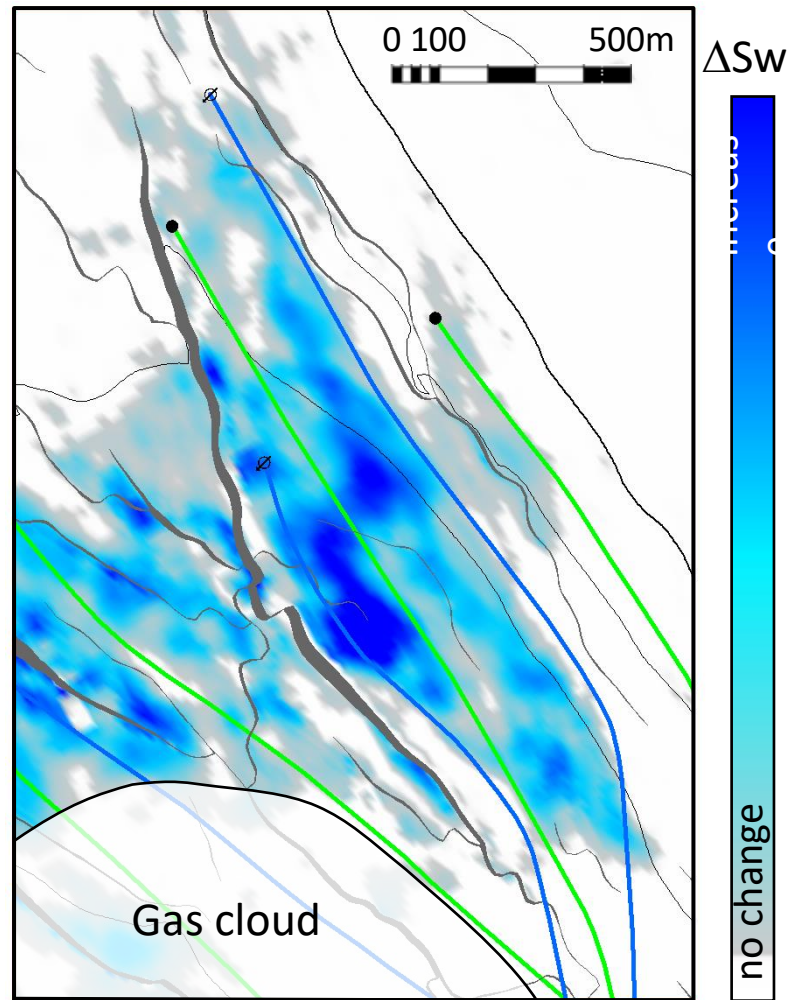
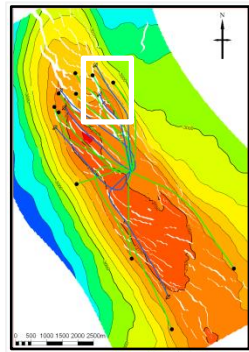
Translate elastic properties (Acoustic impedance AI and Poisson's ratio  $\nu$ ) to petrophysical properties (Porosity  $\Phi$  and Water saturation  $S_w$ ) by using a rock physics model

# Time-lapse rock physics AVO inversion



$\Delta S_w$  from reservoir simulator

$\Delta S_w$  from 4D AVO

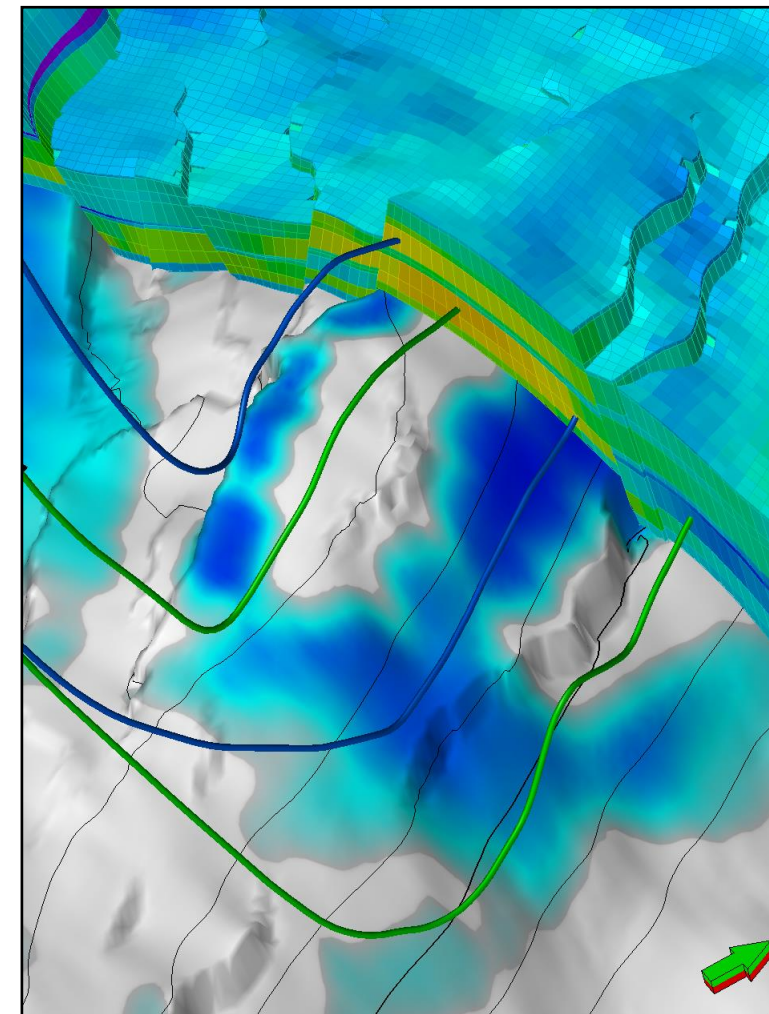
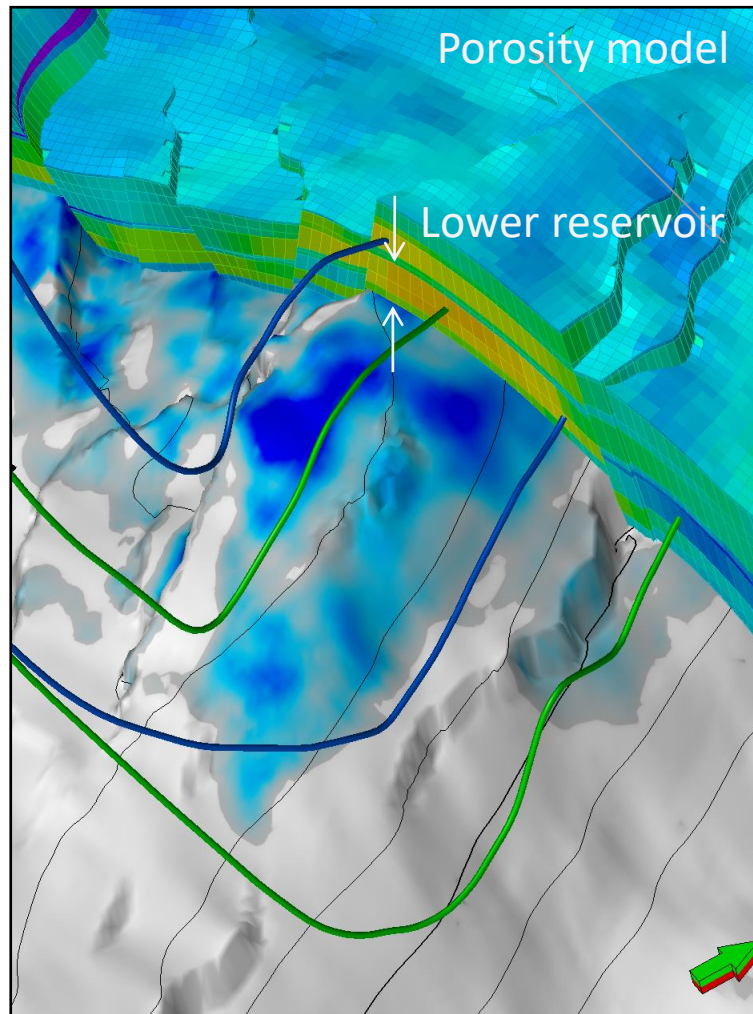
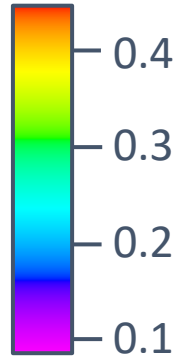


Average water saturation change in lower reservoir (Tor)

$\Delta S_w$  from reservoir simulator

$\Delta S_w$  from 4D AVO

Porosity  $\Phi$   
Sim. Model



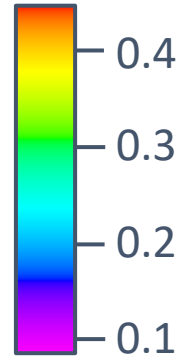
no change  increas

$\Delta S_w$

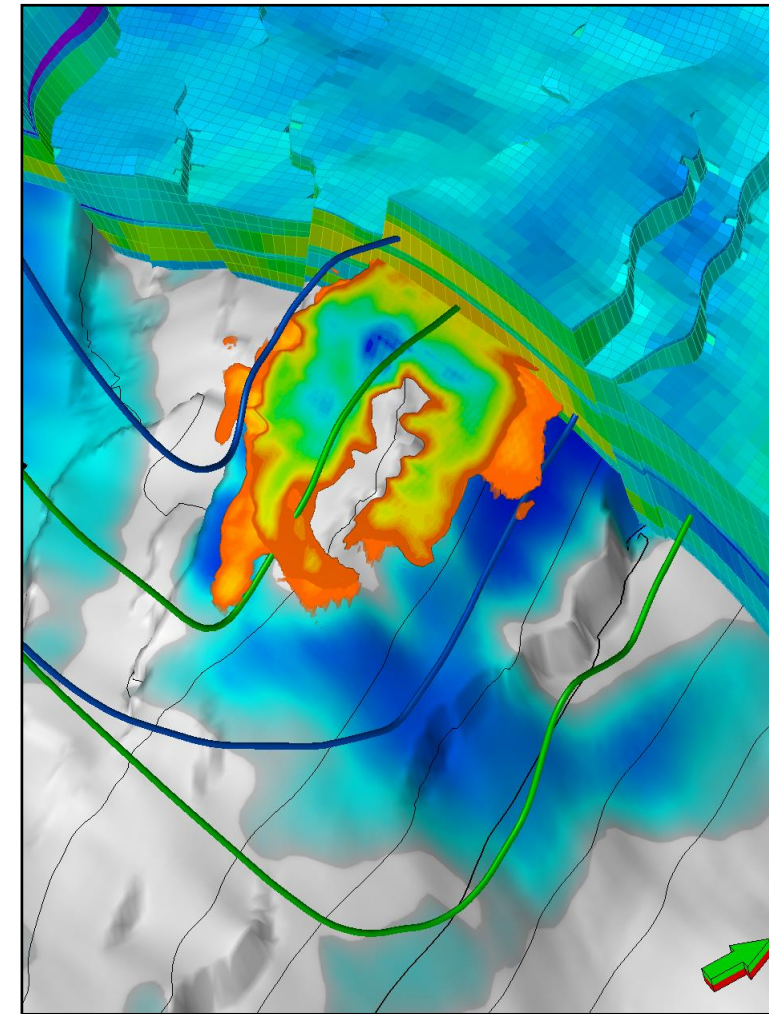
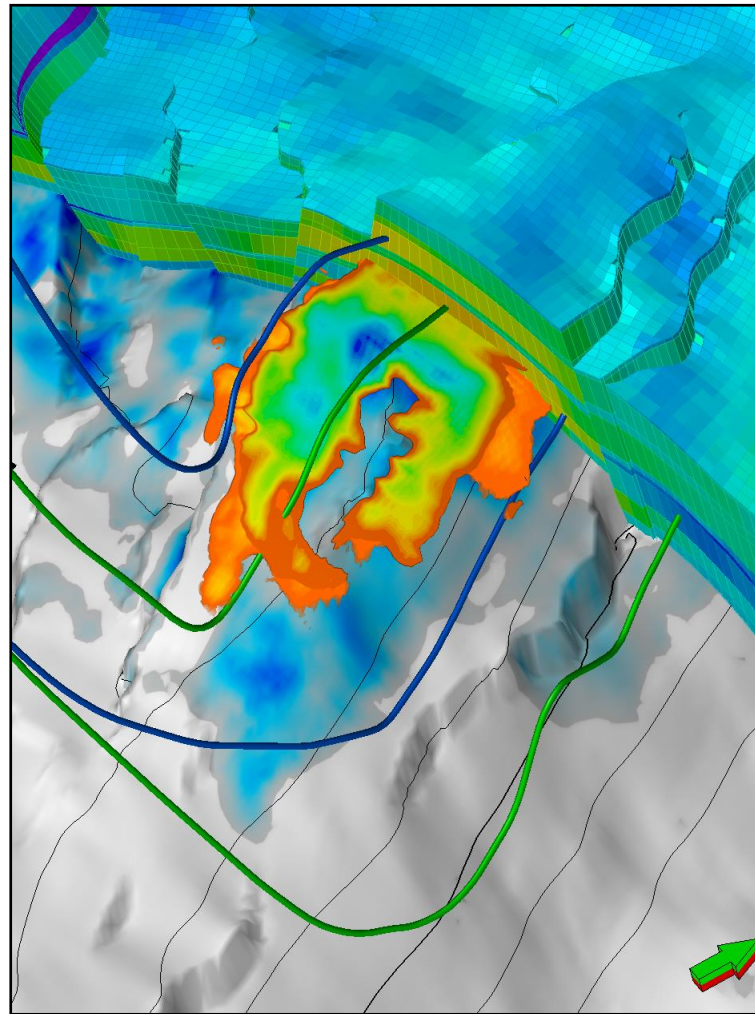
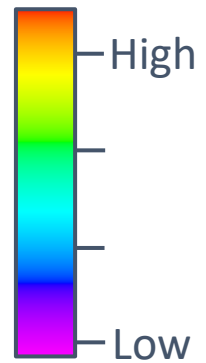
$\Delta S_w$  from reservoir simulator

$\Delta S_w$  from 4D AVO

Porosity  $\Phi$   
Sim. Model



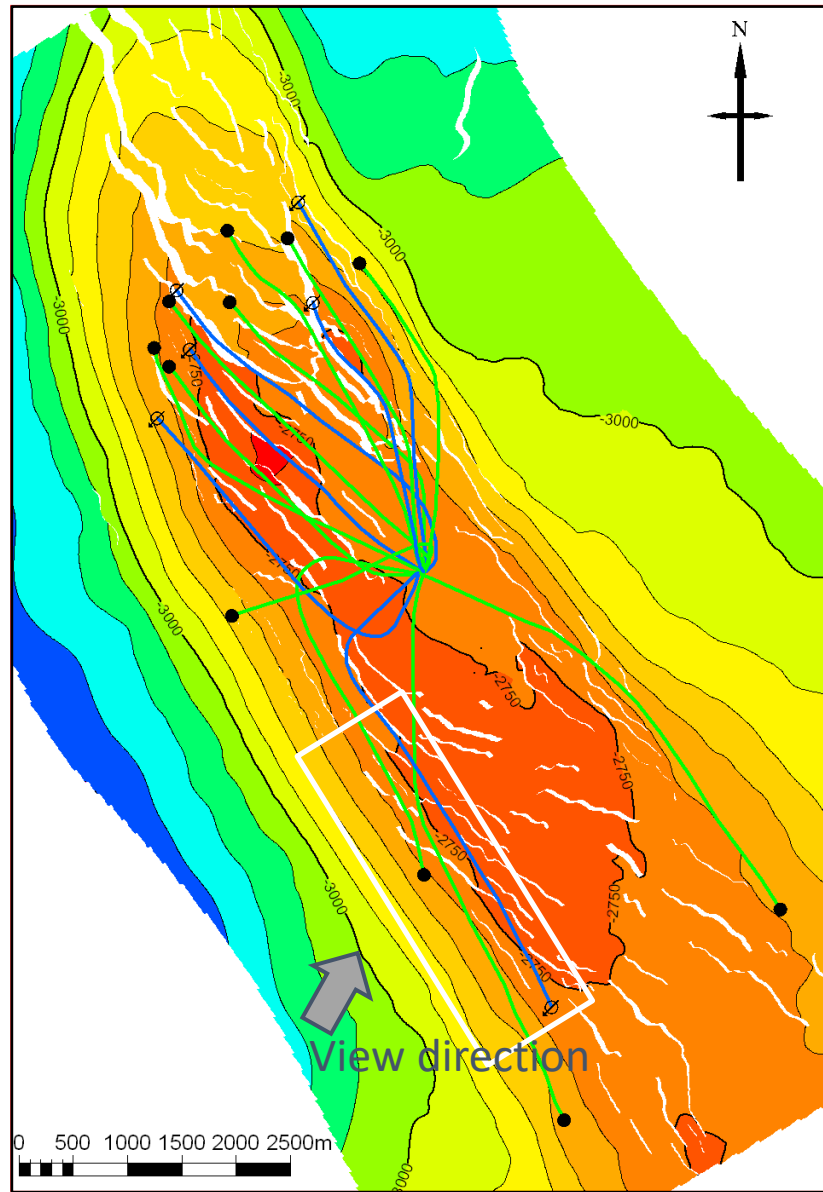
AI  
Geobody



no change increas

$\Delta S_w$

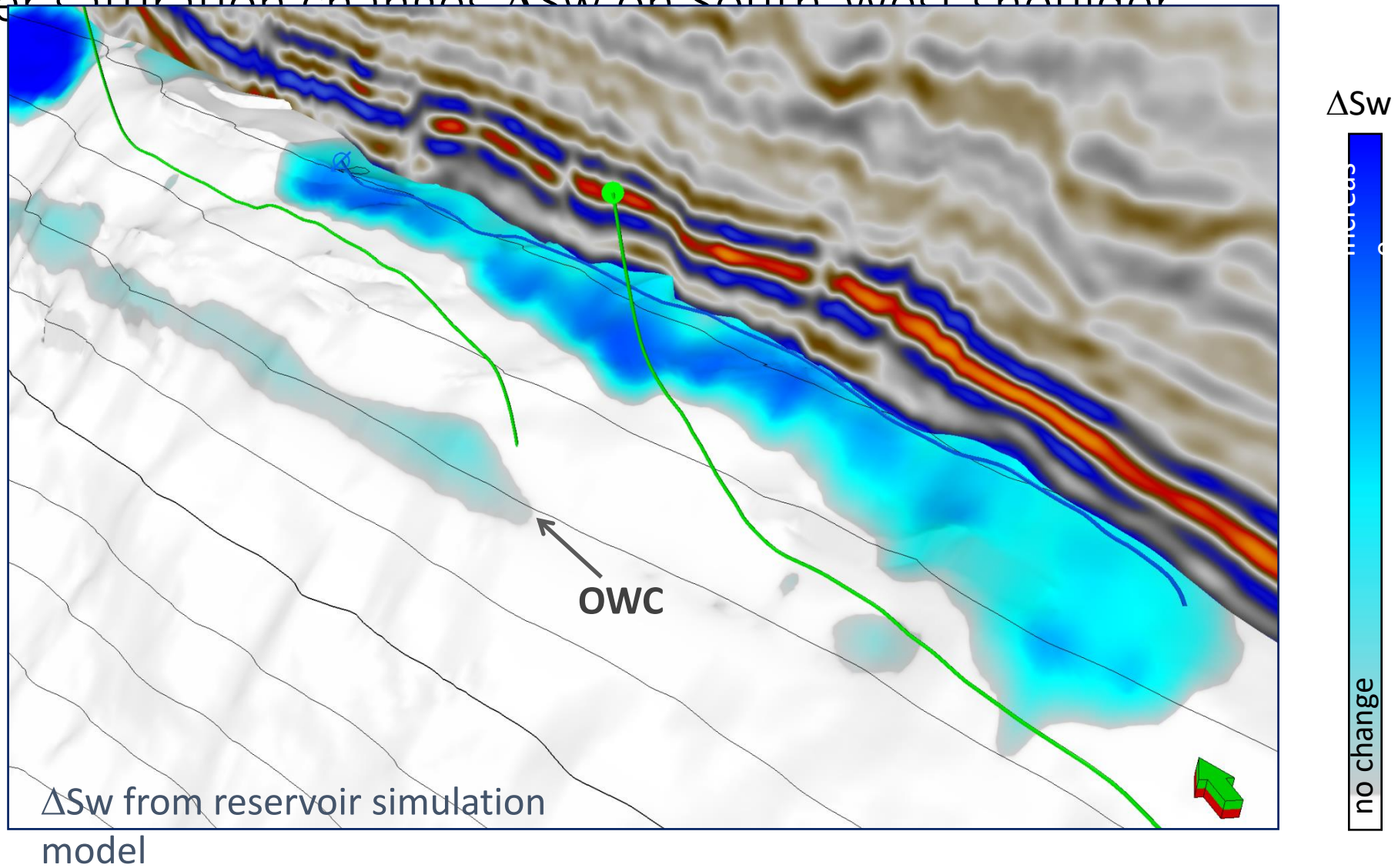
Wat



South-West shoulder  
Compare water saturation  
changes derived from 4D  
AVO inversion and reservoir  
model

- Compare average water saturation in lower reservoir (Tor) interval
- Fault control on flow pathways

# Water saturation changes $\Delta S_w$ on South West shoulder



# Water saturation changes $\Delta S_w$ on South West shoulder

