

Quantitative 3D+4D Seismic imaging, inversion and monitoring inside the earth

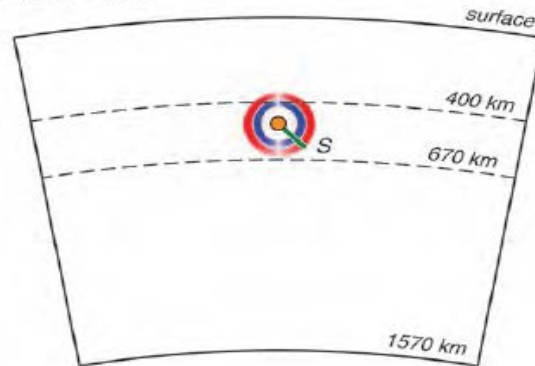
Prof. David Lumley

*Green Chair in Geophysics, Research Center Director, UT Dallas
Adjunct Professor, Physics & Astrophysics, University of Western Australia*

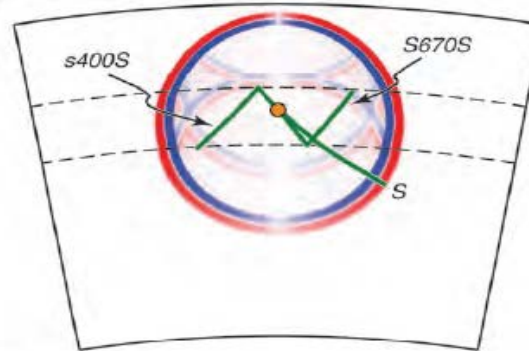
Introduction

Seismology...

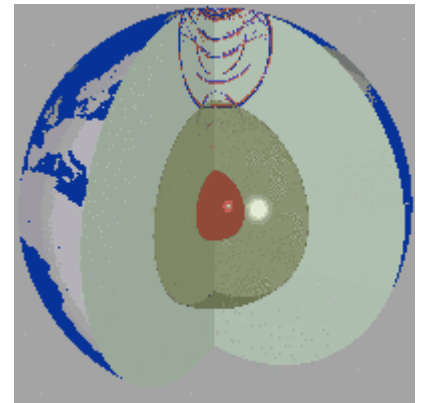
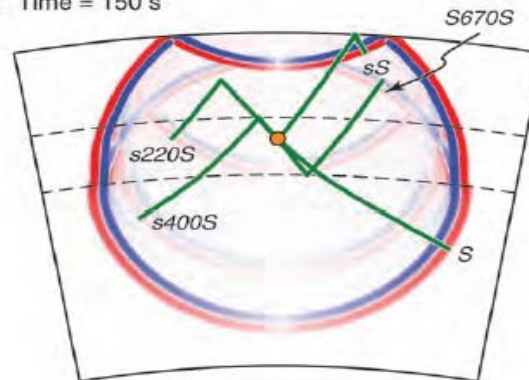
(a) Time = 30 s



(b) Time = 100 s

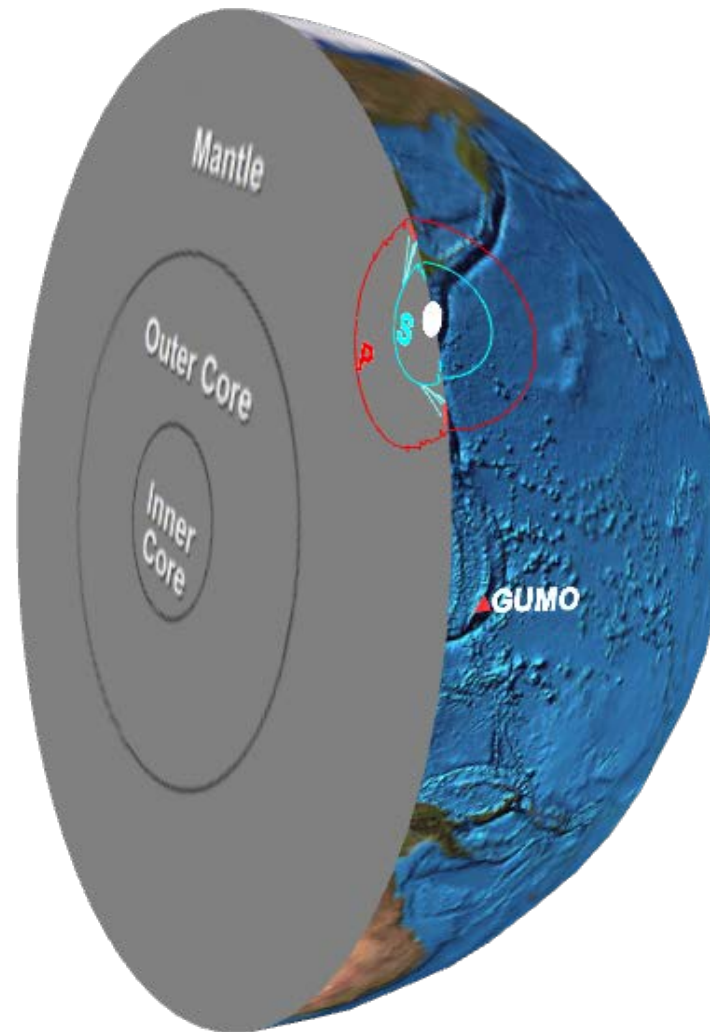


(c) Time = 150 s

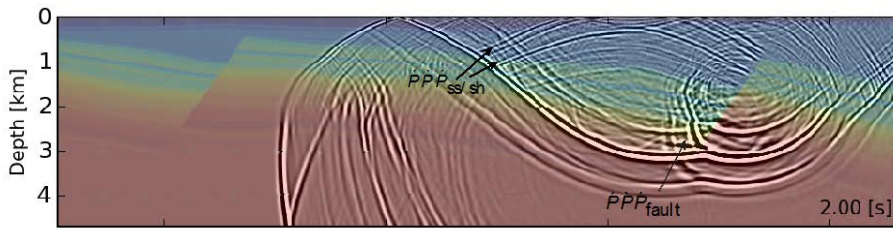
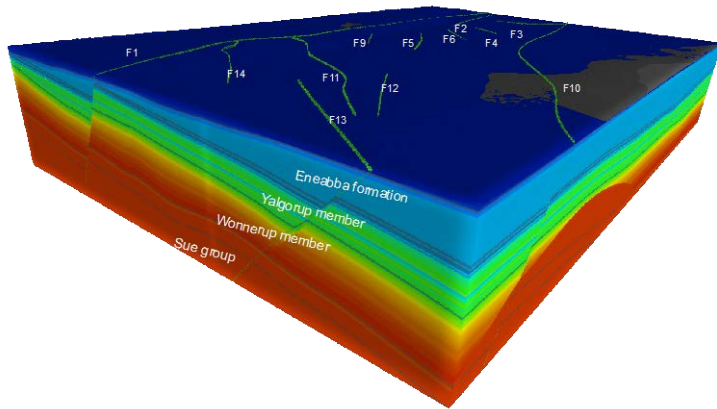


Thorne et al., SRL 2013

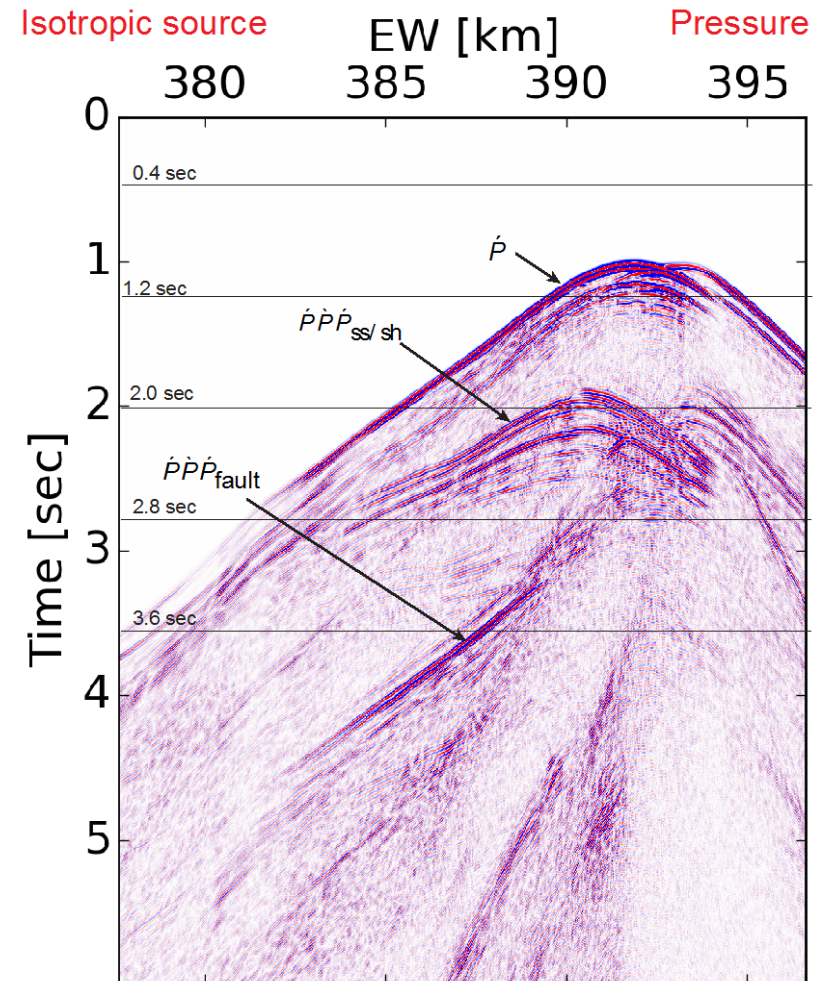
2011 Tohoku earthquake



3D Elastic wavefield modeling...

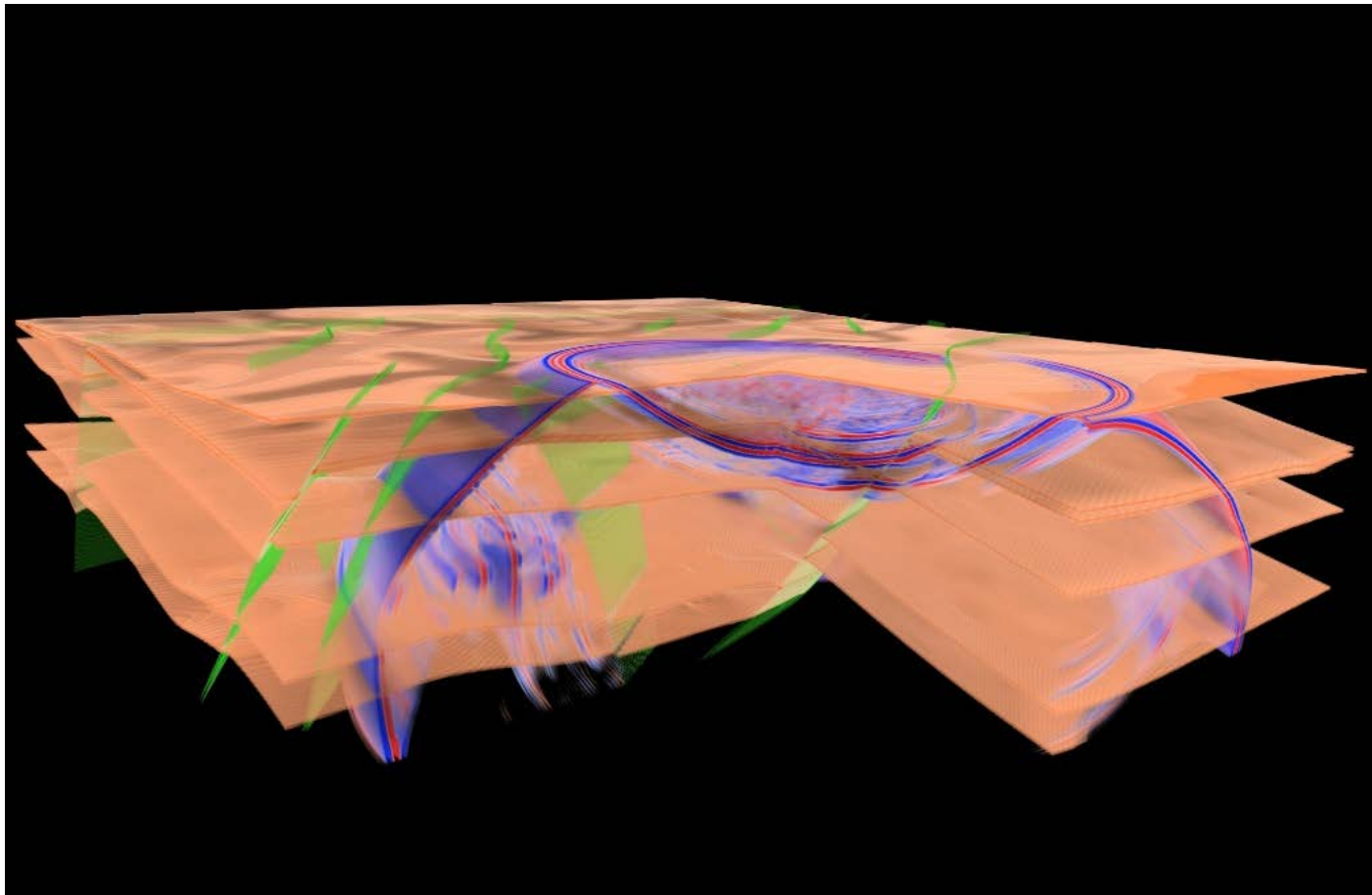


- **Large-scale 3D elastic modelling**
 - >5.2 billion grid points
 - Highly optimized parallel computation



Lumley et al., ANLEC 2016

3D Elastic wavefield modeling...



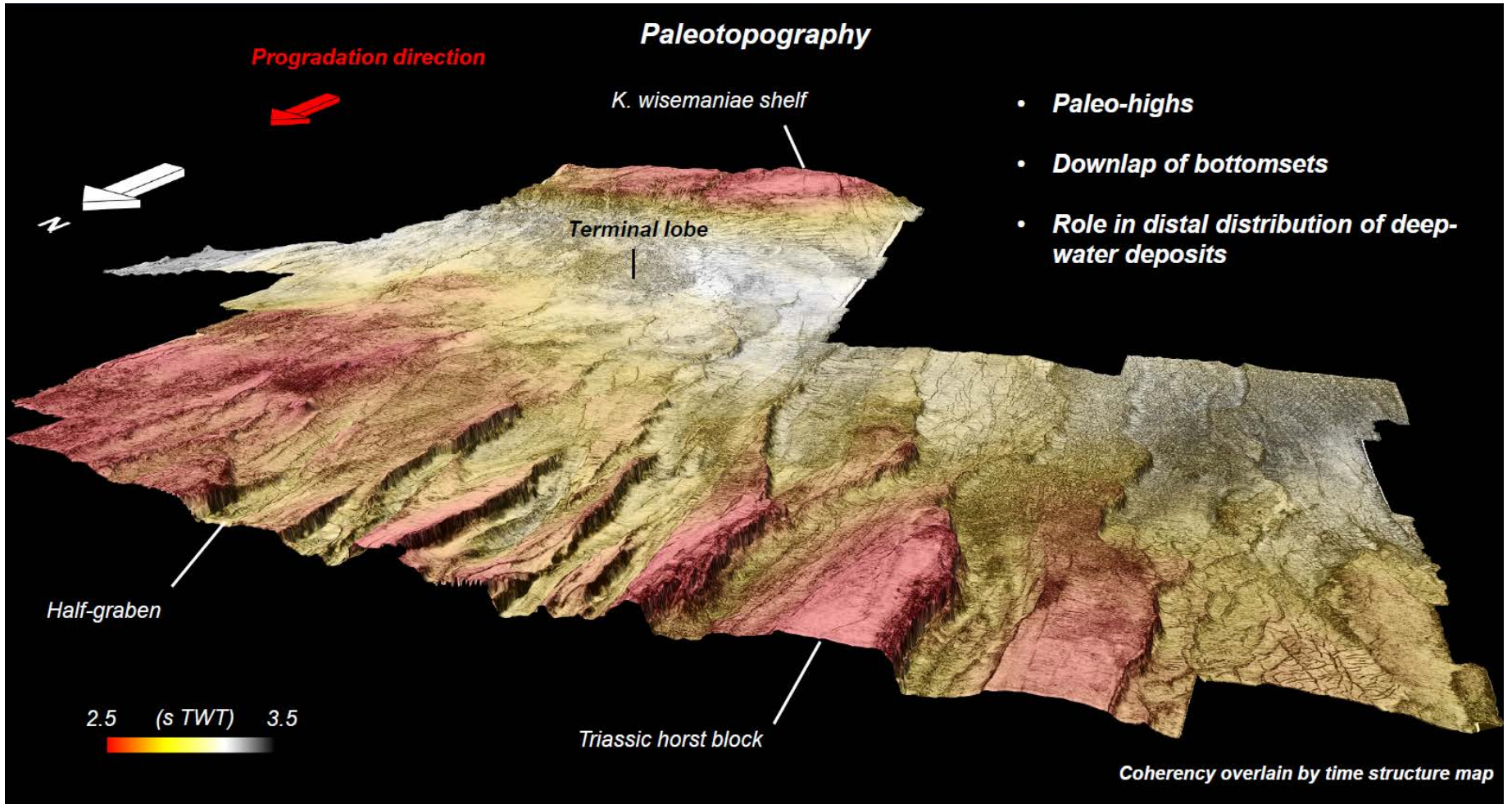
Miyoshi et al., 2016

Imaging... objects + patterns

source, energy, sensors

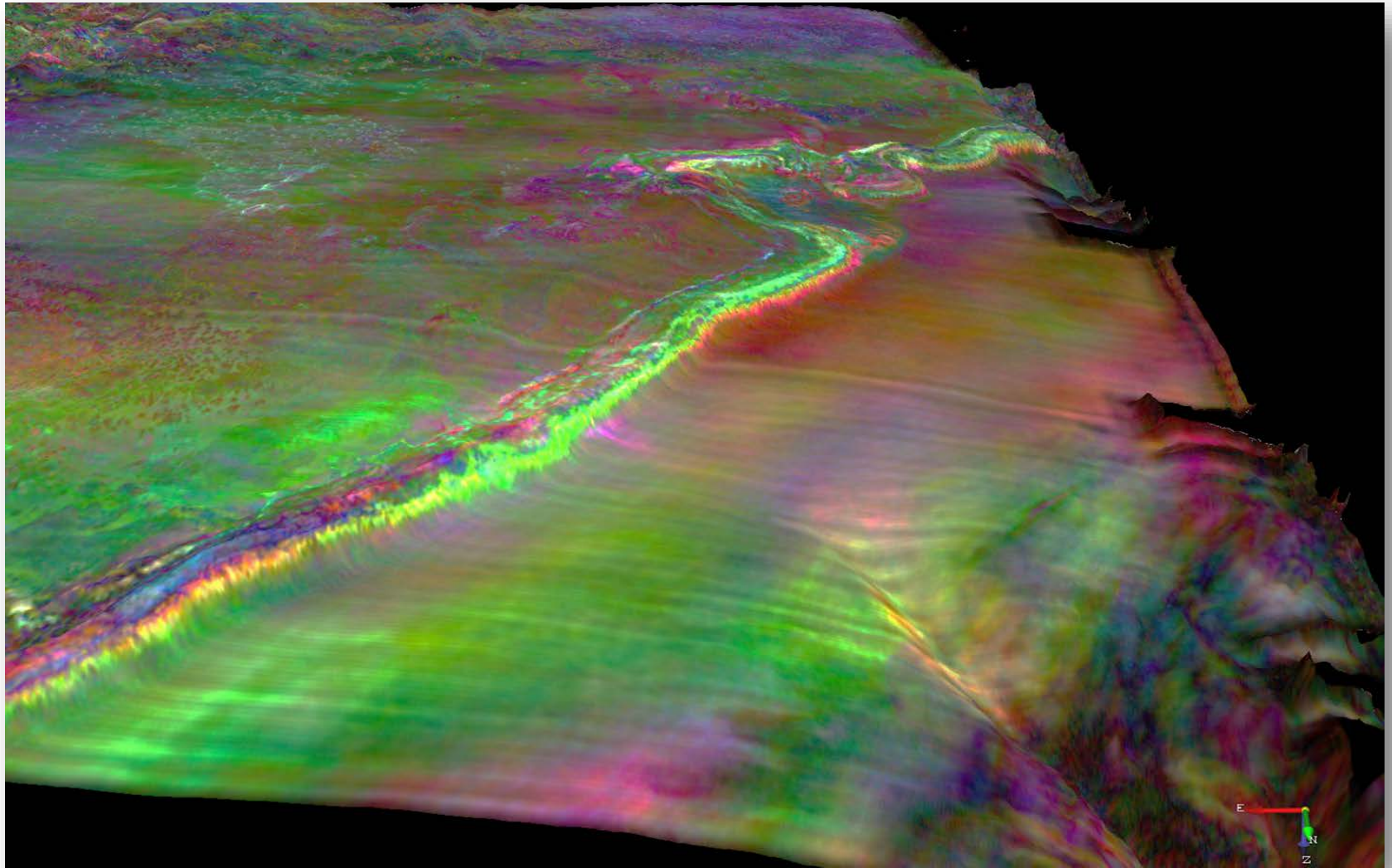


3D Seismic imaging...



Paumard et al., 2015

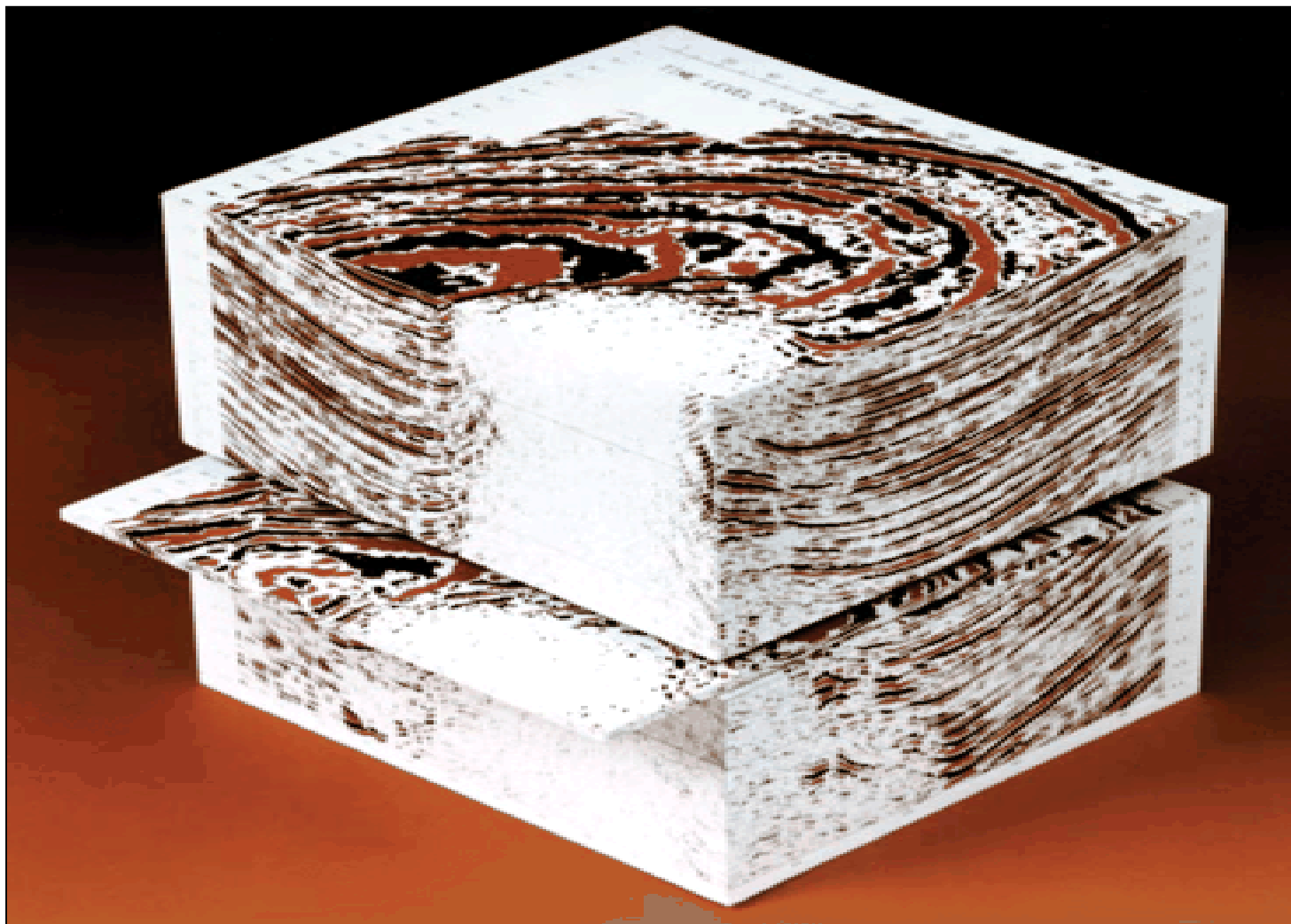
3D Seismic imaging...



Bourget et al., 2014

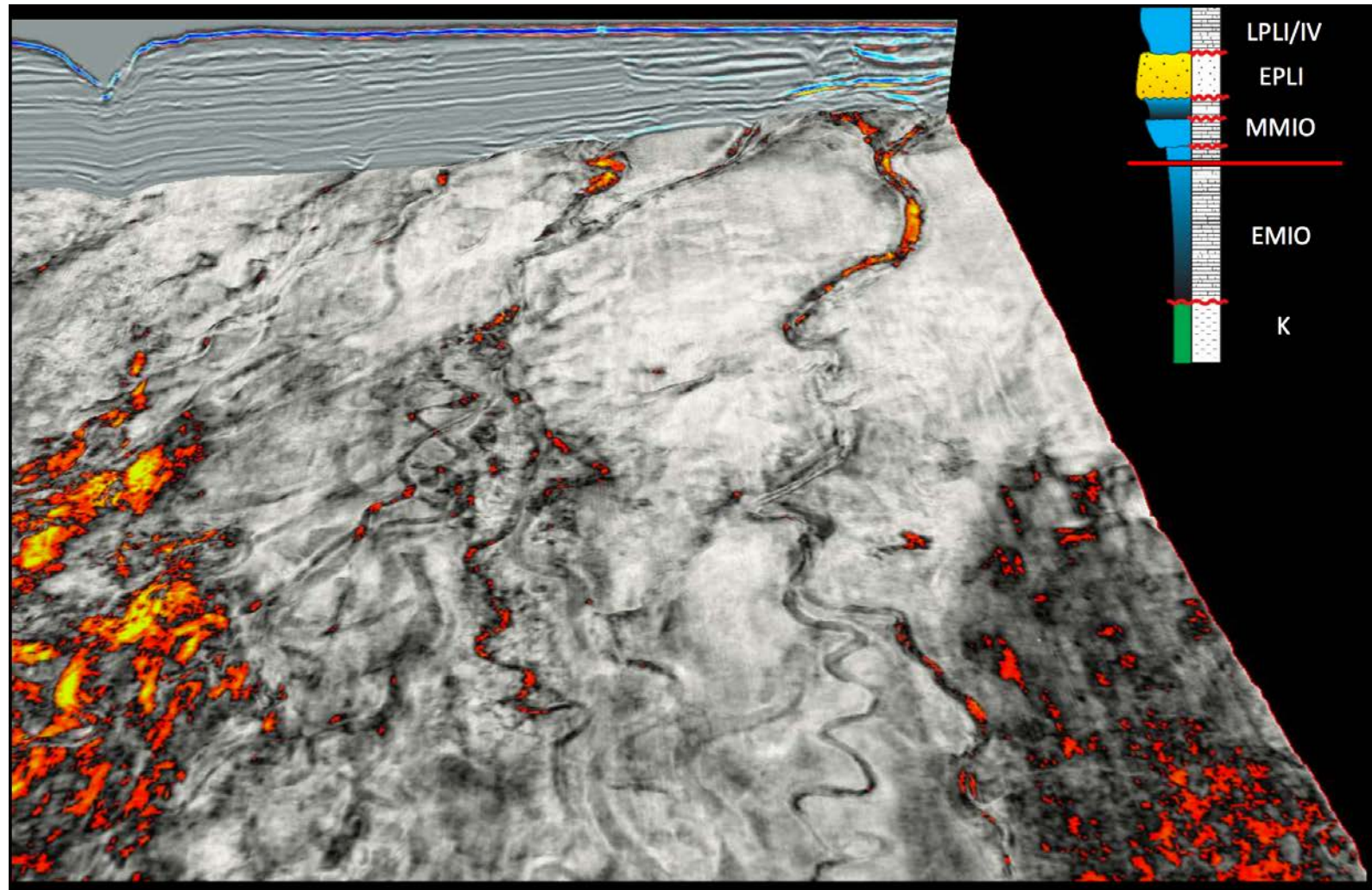
david.lumley@utdallas.edu

3D Seismic imaging...



Dragoet, TLE 2005

3D Seismic imaging...

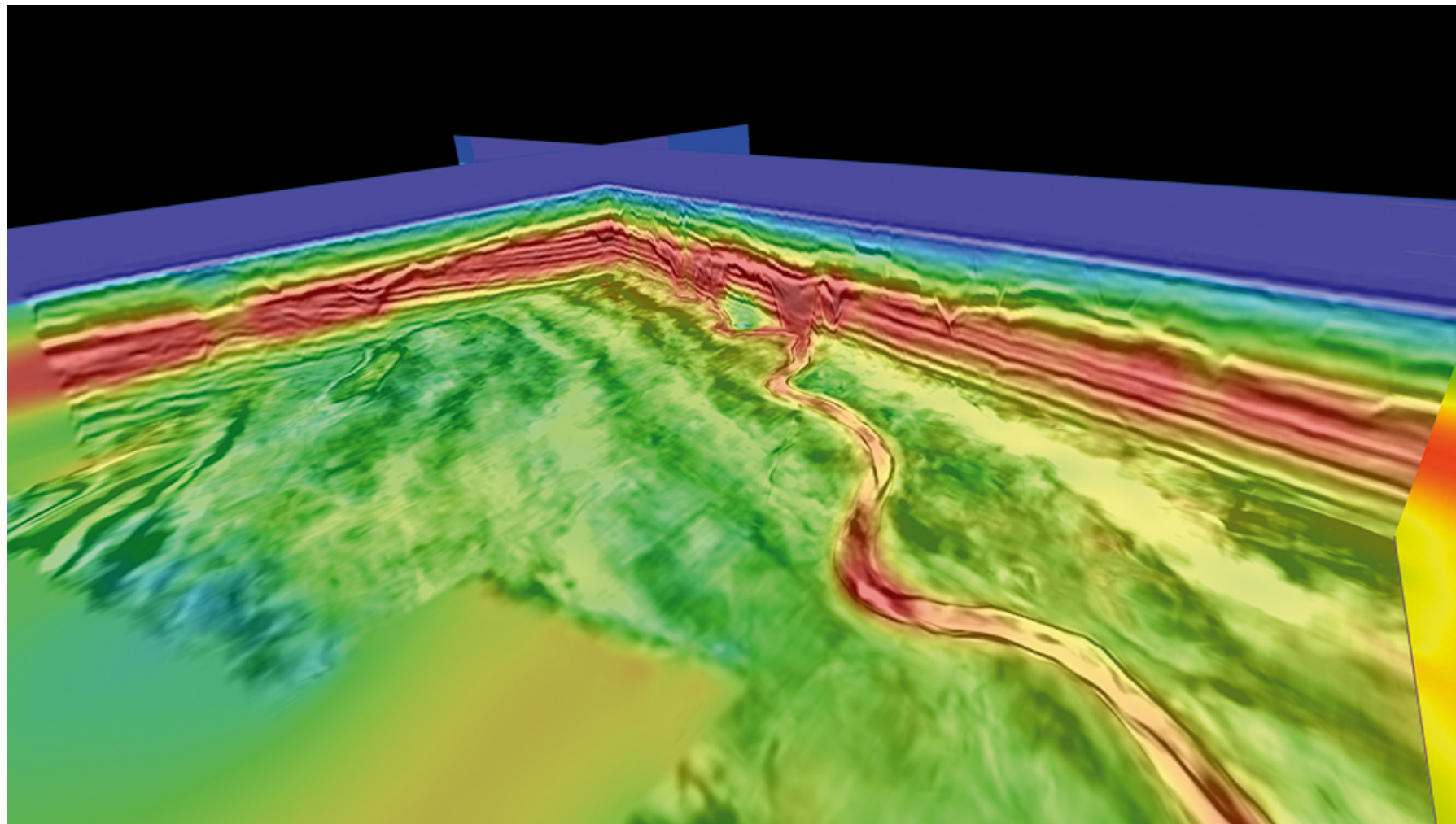


Bourget et al., 2014

Inversion... physical properties

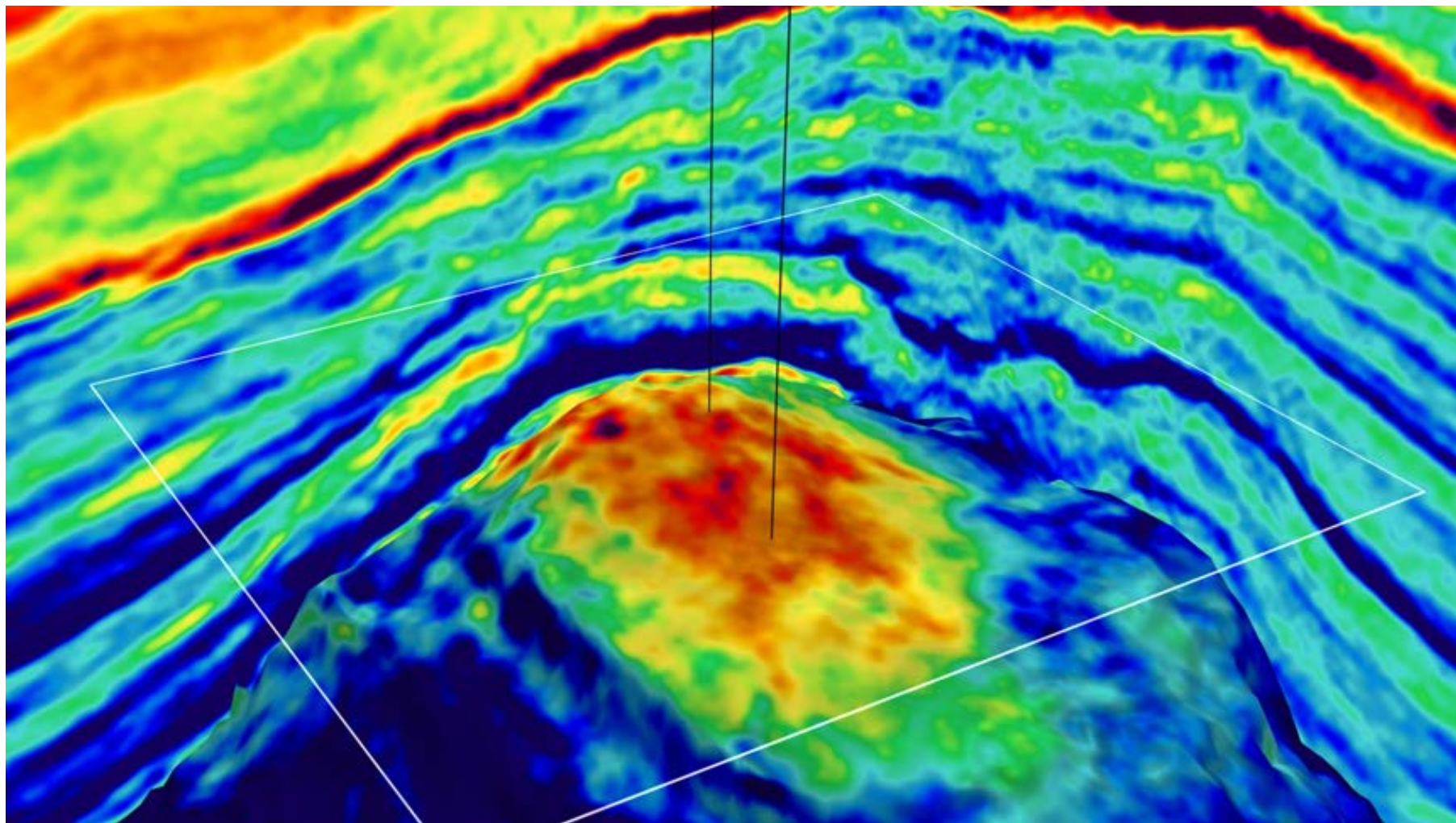


Full waveform inversion



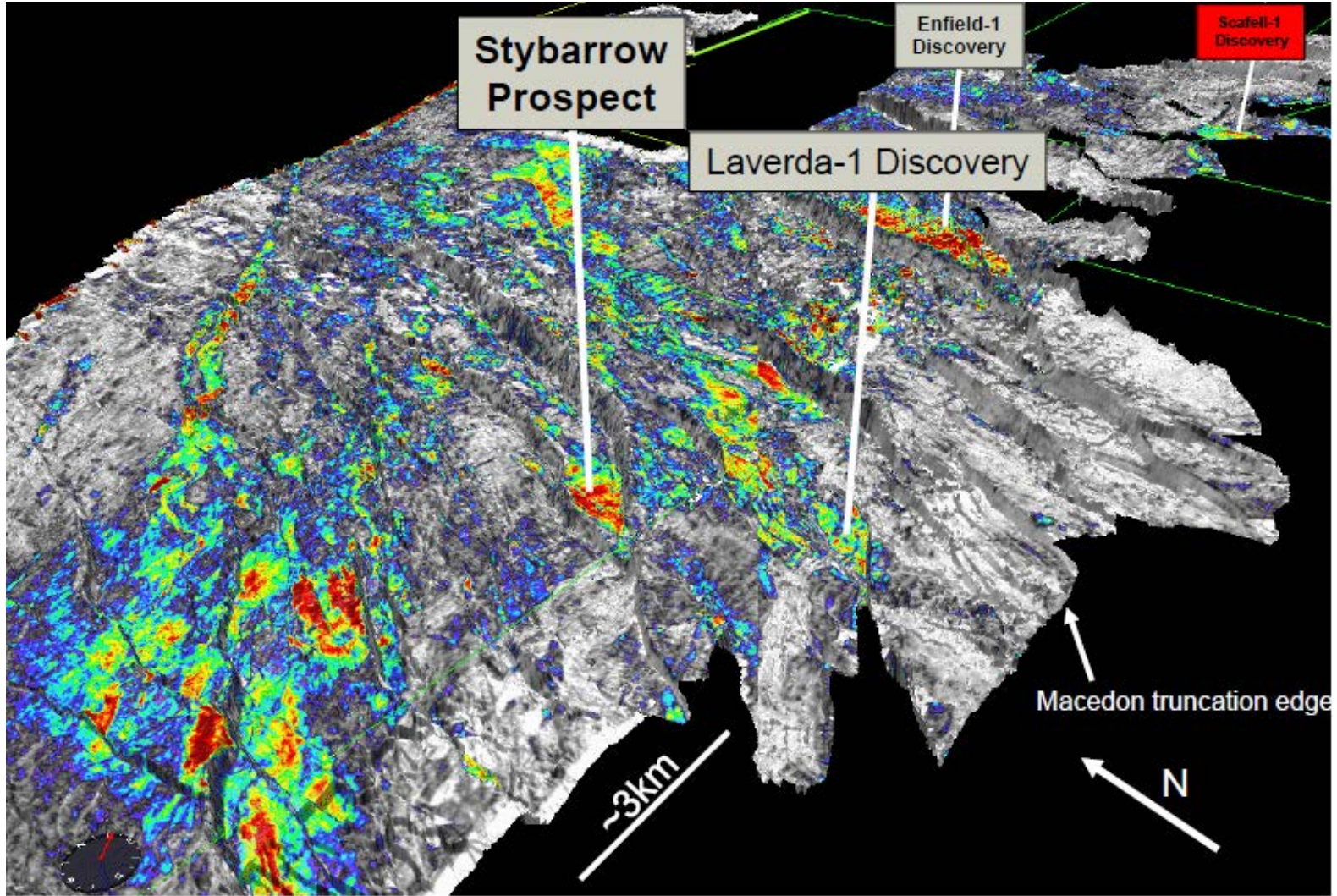
PGS

Full waveform inversion

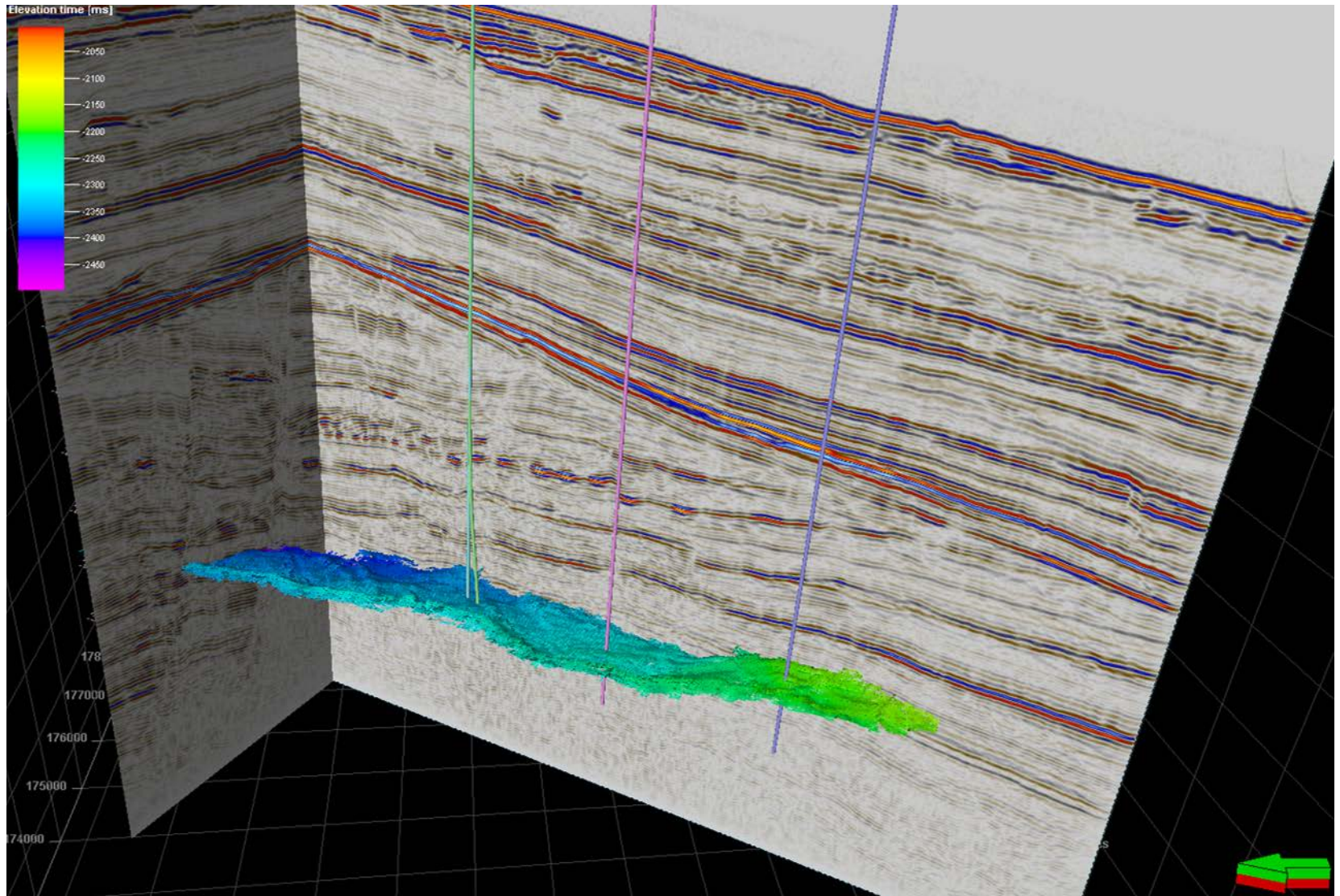


PGS

3D Exploration Seismology

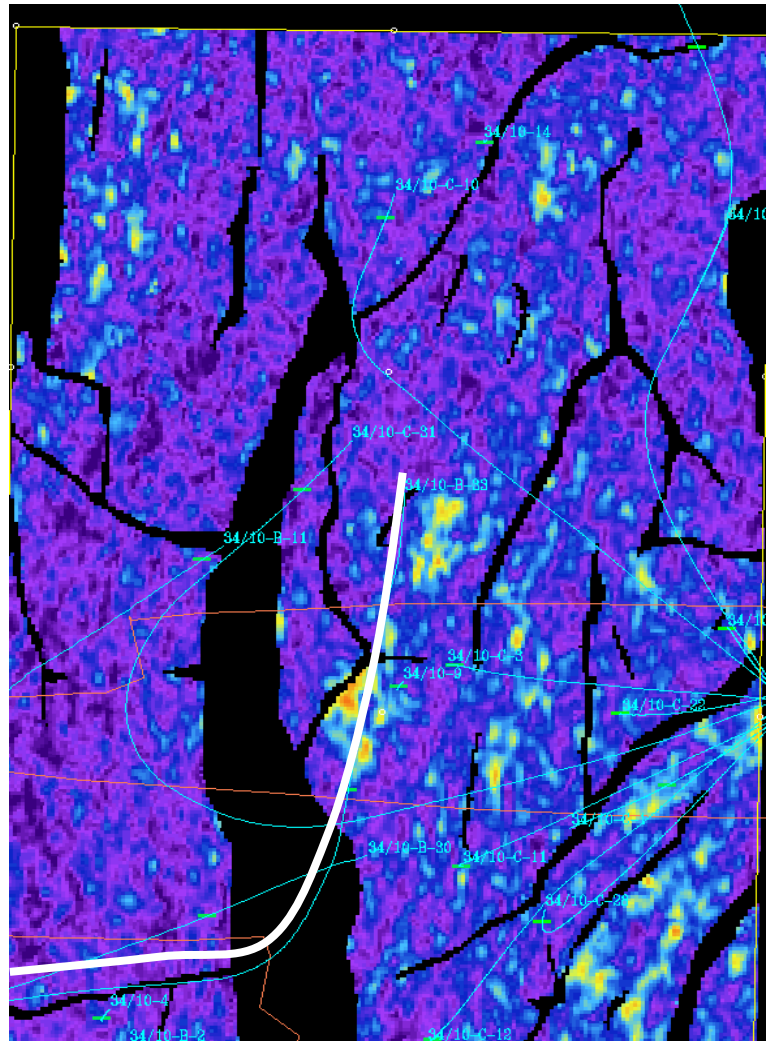


3D+4D Seismic Reservoir Analysis

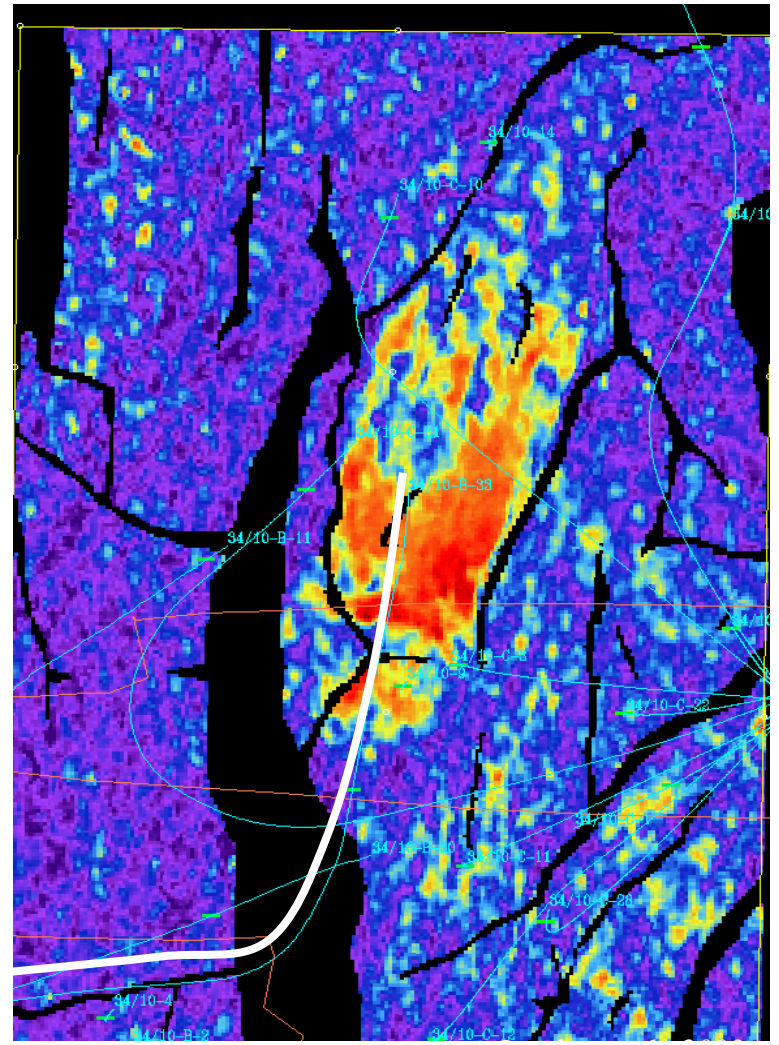


Time-lapse 4D Seismic Monitoring

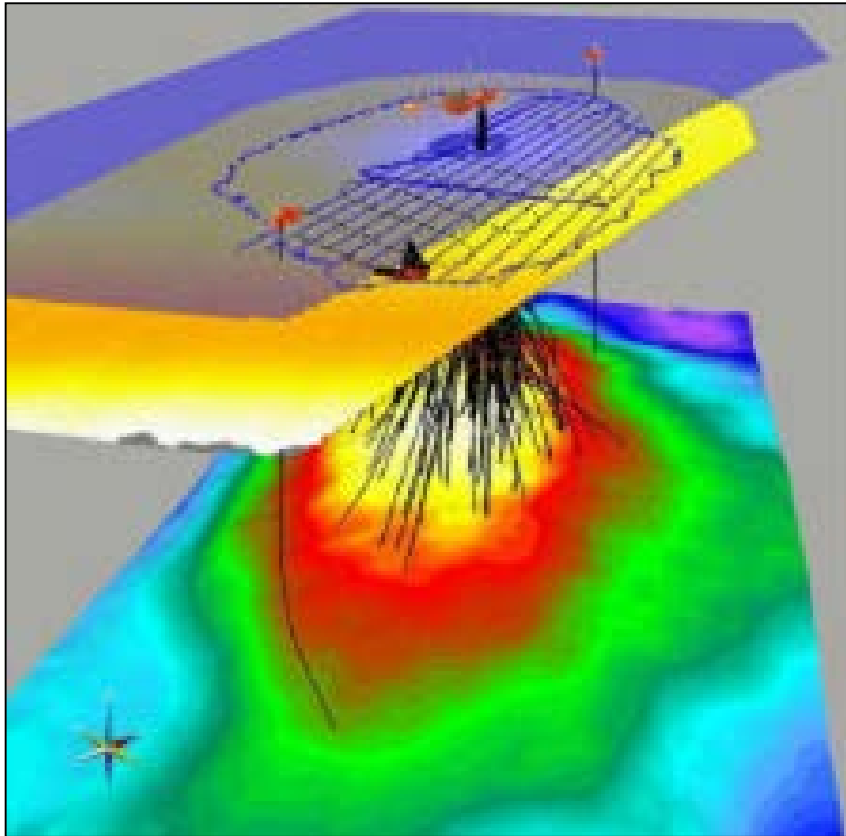
Before



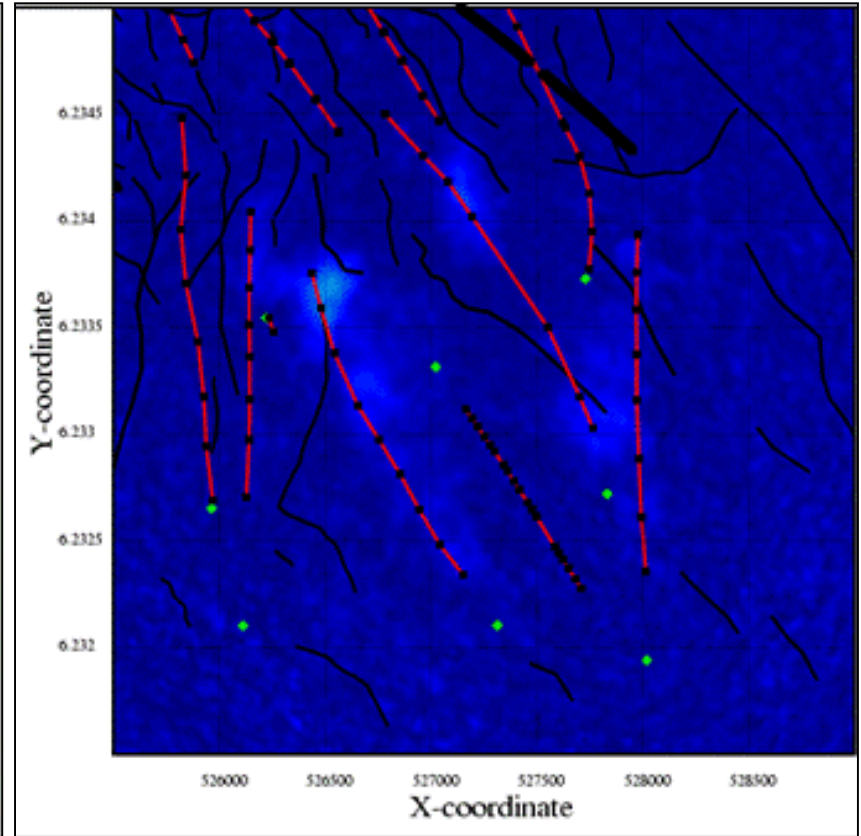
After



Valhall permanent seafloor array



Barkved et al., 2004



courtesy BP

Elastic Wave Equation

Elastic wave equation



<http://blog.gaborit-d.com/les-icomes-gif-3d-moran-goldstein/>

Newton's 2nd Law

$$\mathbf{F}_{total} = \mathbf{F}_{volume} + \mathbf{F}_{surface} = m\mathbf{a}$$

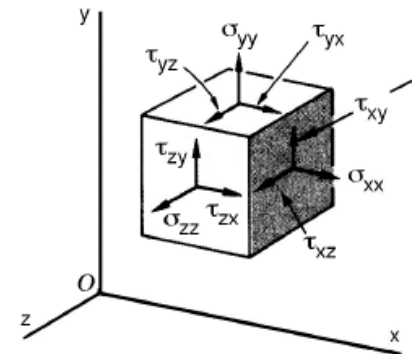
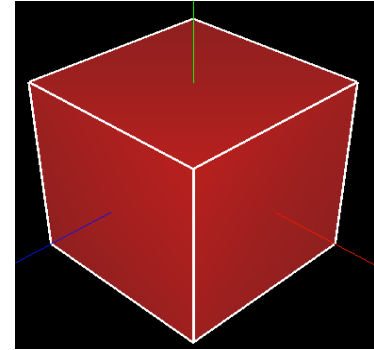
Body force: $f_i = F_i/V$

Surface force (Traction): $T_i = F_i/A$

$$\mathbf{F}_{total} = \int_v \mathbf{f}_i + \int_s \mathbf{T}_i = m\ddot{\mathbf{u}}_i$$

Stress: $T_i = \sigma_{ij} n_j$; $\sigma_{ij} = T_j x_i$

$$\mathbf{F}_{total} = \int_v \mathbf{f}_i + \int_s \sigma_{ij} n_j = m\ddot{\mathbf{u}}_i$$



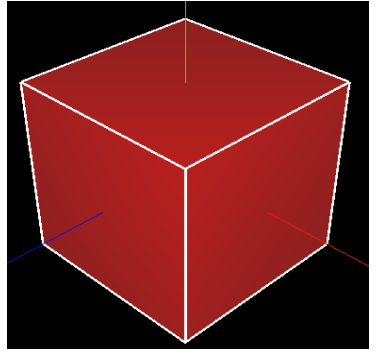
General elastic wave equation

$$\mathbf{F}_{total} = \int_V \mathbf{f}_i + \int_S \sigma_{ij} \mathbf{n}_j = m\ddot{\mathbf{u}}_i$$

Gauss Divergence Theorem

$$\int_S \mathbf{F} \cdot \mathbf{n} = \int_V \nabla \cdot \mathbf{F}$$

$$\mathbf{F}_{total} = \int_V \mathbf{f}_i + \int_V \partial_j \sigma_{ij} = \int_V \rho \ddot{\mathbf{u}}_i$$



$$\rho \ddot{\mathbf{u}}_i - \partial_j \sigma_{ij} = \mathbf{f}_i \quad \text{Elastic Wagn \#1}$$

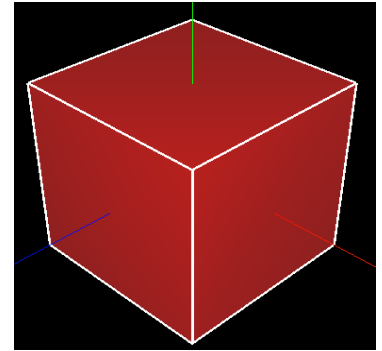
$$\rho \partial_t v_i - \partial_j \sigma_{ij} = \mathbf{f}_i$$

“velocity-stress FD/FEM method”

Linear Stress and Strain

Strain: $\epsilon_{kl} = \frac{1}{2} (\partial_k u_l + \partial_l u_k)$

Normal: $k = l$ Shear: $k \neq l$



Generalized Hooke's Law (linear stress-strain)

$$\sigma_{ij} = C_{ijkl} \epsilon_{kl} \quad C_{ijkl} : \text{elastic stiffness tensor}$$

$$\rho \ddot{u}_i - \partial_j C_{ijkl} \epsilon_{kl} = f_i \quad \text{Elastic Wagn \#2}$$

Elastic Stiffness Tensor C_{ijkl}

- 81 coefficients in general, but due to symmetry etc.
 - Reduces to **21** independent coefficients
- C_{ijkl} can be written in compact 6x6 Voigt notation as C_{ij}

$$\begin{bmatrix} \sigma_{11} \\ \sigma_{22} \\ \sigma_{33} \\ \sigma_{23} \\ \sigma_{13} \\ \sigma_{12} \end{bmatrix} = \begin{bmatrix} C_{1111} & C_{1122} & C_{1133} & C_{1123} & C_{1113} & C_{1112} \\ & C_{2222} & C_{2233} & C_{2223} & C_{2213} & C_{2212} \\ & & C_{3333} & C_{3323} & C_{3313} & C_{3312} \\ & & & C_{2323} & C_{2313} & C_{2312} \\ & & & & C_{1313} & C_{1312} \\ & & & & & C_{1212} \end{bmatrix} \begin{bmatrix} \epsilon_{11} \\ \epsilon_{22} \\ \epsilon_{33} \\ 2\epsilon_{23} \\ 2\epsilon_{13} \\ 2\epsilon_{12} \end{bmatrix}$$

symm

www.web.mit.edu

Voigt Elastic Stiffness Tensor \mathbf{C}_{ij}

- \mathbf{C}_{ijkl} can be written in compact 6x6 Voigt notation as \mathbf{C}_{ij}

$$\begin{bmatrix} \sigma_{11} \\ \sigma_{22} \\ \sigma_{33} \\ \sigma_{23} \\ \sigma_{13} \\ \sigma_{12} \end{bmatrix} = \begin{bmatrix} C_{1111} & C_{1122} & C_{1133} & C_{1123} & C_{1113} & C_{1112} \\ & C_{2222} & C_{2233} & C_{2223} & C_{2213} & C_{2212} \\ & & C_{3333} & C_{3323} & C_{3313} & C_{3312} \\ & & & C_{2323} & C_{2313} & C_{2312} \\ & \text{symm} & & & C_{1313} & C_{1312} \\ & & & & & C_{1212} \end{bmatrix} \begin{bmatrix} \epsilon_{11} \\ \epsilon_{22} \\ \epsilon_{33} \\ 2\epsilon_{23} \\ 2\epsilon_{13} \\ 2\epsilon_{12} \end{bmatrix}$$

$$\begin{bmatrix} \sigma_1 \\ \sigma_2 \\ \sigma_3 \\ \sigma_4 \\ \sigma_5 \\ \sigma_6 \end{bmatrix} = \begin{bmatrix} C_{11} & C_{12} & C_{13} & C_{14} & C_{15} & C_{16} \\ & C_{22} & C_{23} & C_{24} & C_{25} & C_{26} \\ & & C_{33} & C_{34} & C_{35} & C_{36} \\ & & & C_{44} & C_{45} & C_{46} \\ & \text{symm} & & & C_{55} & C_{56} \\ & & & & & C_{66} \end{bmatrix} \begin{bmatrix} \epsilon_1 \\ \epsilon_2 \\ \epsilon_3 \\ \epsilon_4 \\ \epsilon_5 \\ \epsilon_6 \end{bmatrix}$$

Elastic Stiffness Tensor c_{ijkl}

- Isotropic

- 2 independent coefficients... λ and μ ... “*Lamé parameters*”

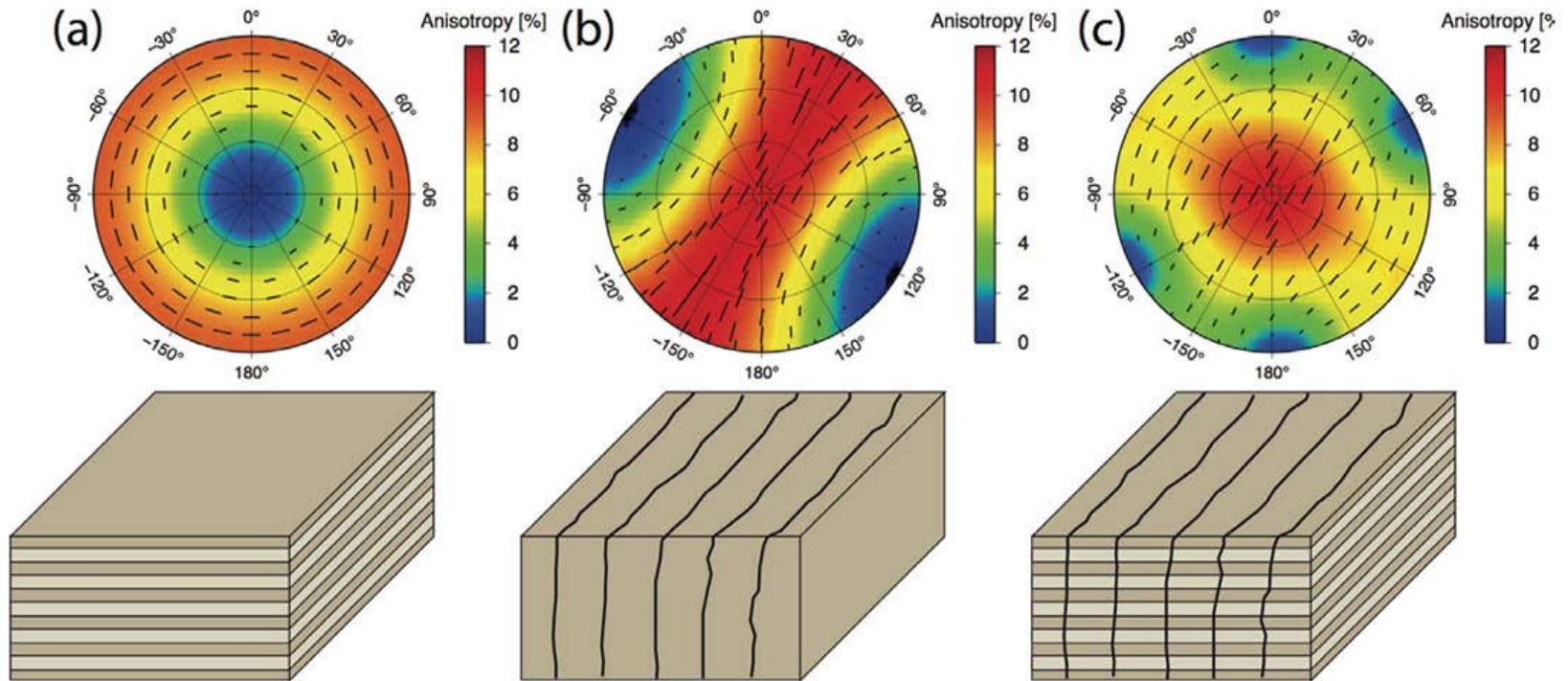
$$\{c_{ij}\} = \begin{pmatrix} \lambda + 2\mu & \lambda & \lambda & 0 & 0 & 0 \\ \lambda & \lambda + 2\mu & \lambda & 0 & 0 & 0 \\ \lambda & \lambda & \lambda + 2\mu & 0 & 0 & 0 \\ 0 & 0 & 0 & 2\mu & 0 & 0 \\ 0 & 0 & 0 & 0 & 2\mu & 0 \\ 0 & 0 & 0 & 0 & 0 & 2\mu \end{pmatrix}.$$

Seismic Anisotropy

VTI

HTI

Ortho

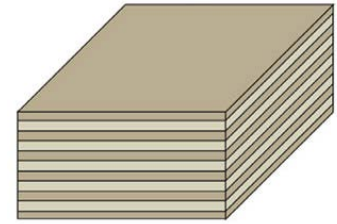


after Kendall et al., CSEGR 2014

Elastic Stiffness Tensor c_{ijke}

- VTI (polar) anisotropy

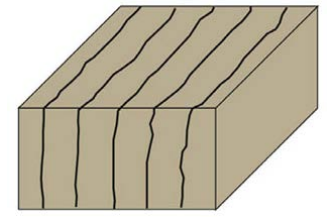
- 5 independent coefficients $*c_{12} = c_{11} - 2c_{66}$



$$C_{\text{VTI}} = \begin{bmatrix} c_{11} & c_{12}^* & c_{13} & 0 & 0 & 0 \\ c_{12}^* & c_{11} & c_{13} & 0 & 0 & 0 \\ c_{13} & c_{13} & c_{33} & 0 & 0 & 0 \\ 0 & 0 & 0 & c_{44} & 0 & 0 \\ 0 & 0 & 0 & 0 & c_{44} & 0 \\ 0 & 0 & 0 & 0 & 0 & c_{66} \end{bmatrix}$$

Elastic Stiffness Tensor c_{ijke}

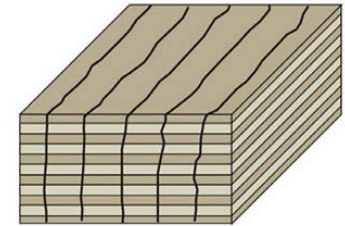
- HTI (azimuthal) anisotropy
 - 5 independent coefficients



$$\mathbf{c}^{(HTI)} = \begin{bmatrix}
 c_{11} & c_{13} & c_{13} & 0 & 0 & 0 \\
 c_{13} & c_{33} & c_{33} - 2c_{44} & 0 & 0 & 0 \\
 c_{13} & c_{33} - 2c_{44} & c_{33} & 0 & 0 & 0 \\
 0 & 0 & 0 & c_{44} & 0 & 0 \\
 0 & 0 & 0 & 0 & c_{55} & 0 \\
 0 & 0 & 0 & 0 & 0 & c_{55}
 \end{bmatrix}$$

Elastic Stiffness Tensor C_{ijkl}

- Orthorhombic anisotropy
 - 9 independent coefficients



$$\mathbf{C} = \begin{pmatrix} C_{11} & C_{12} & C_{13} & 0 & 0 & 0 \\ C_{12} & C_{22} & C_{23} & 0 & 0 & 0 \\ C_{13} & C_{23} & C_{33} & 0 & 0 & 0 \\ 0 & 0 & 0 & C_{44} & 0 & 0 \\ 0 & 0 & 0 & 0 & C_{55} & 0 \\ 0 & 0 & 0 & 0 & 0 & C_{66} \end{pmatrix} .$$

Elastic Stiffness Tensor c_{ijkl}

- Monoclinic anisotropy
 - 13 independent coefficients

$$\mathbf{C}' = \begin{bmatrix}
 c'_{11} & c'_{12} & c'_{13} & 0 & 0 & c'_{16} \\
 c'_{12} & c'_{22} & c'_{23} & 0 & 0 & c'_{26} \\
 c'_{13} & c'_{23} & c'_{33} & 0 & 0 & c'_{36} \\
 0 & 0 & 0 & c'_{44} & c'_{45} & 0 \\
 0 & 0 & 0 & c'_{45} & c'_{55} & 0 \\
 c'_{16} & c'_{26} & c'_{36} & 0 & 0 & c'_{66}
 \end{bmatrix}$$

Isotropic elastic wave equation

$$\rho \ddot{u}_i - \partial_j C_{ijk\ell} e_{k\ell} = f_i \quad \text{Eqn\#2}$$

$$\rho \ddot{\underline{u}} - \nabla \cdot \underline{\underline{C}} : (\nabla \underline{u} + \nabla \underline{u}^T) / 2 = \underline{f}$$

substitute $\underline{\underline{C}}_{iso}$; assume ~ homogeneous: $\partial \lambda, \partial \mu \sim 0$

$$\rho \ddot{\underline{u}} = \underline{f} + \rho v_p^2 \nabla (\nabla \cdot \underline{u}) - \rho v_s^2 \nabla \times (\nabla \times \underline{u}) \quad \#3$$

P-wave velocity: $v_p^2 = (\lambda + 2\mu) / \rho$

S-wave velocity: $v_s^2 = \mu / \rho$

P-wave scalar wave equation (iso)

$$\rho \underline{\ddot{u}} = \underline{f} + \rho v_p^2 \nabla (\nabla \cdot \underline{u}) - \rho v_s^2 \nabla \times (\nabla \times \underline{u}) \quad \#3$$

Take Divergence of Eqn #3... let $P = \nabla \cdot \underline{u}$

$$(\partial_{tt} - v_p^2 \nabla^2) P(\underline{x}, t) = \delta_p(\underline{x}, t) \quad \text{Weqn \#4}$$

P-wave velocity: $v_p^2 = (\lambda + 2\mu) / \rho$

S-wave vector wave equation (iso)

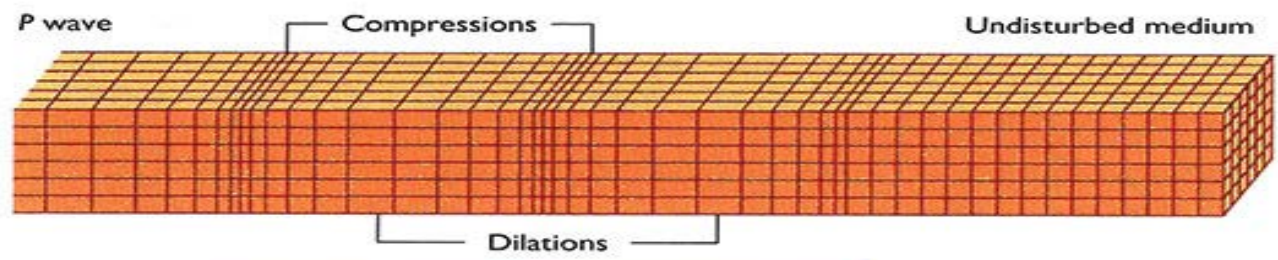
$$\rho \underline{\ddot{u}} = \underline{f} + \rho v_p^2 \nabla (\nabla \cdot \underline{u}) - \rho v_s^2 \nabla \times (\nabla \times \underline{u}) \quad \#3$$

Take Curl of Eqn #3... let $\underline{Q} = \nabla \times \underline{u}$

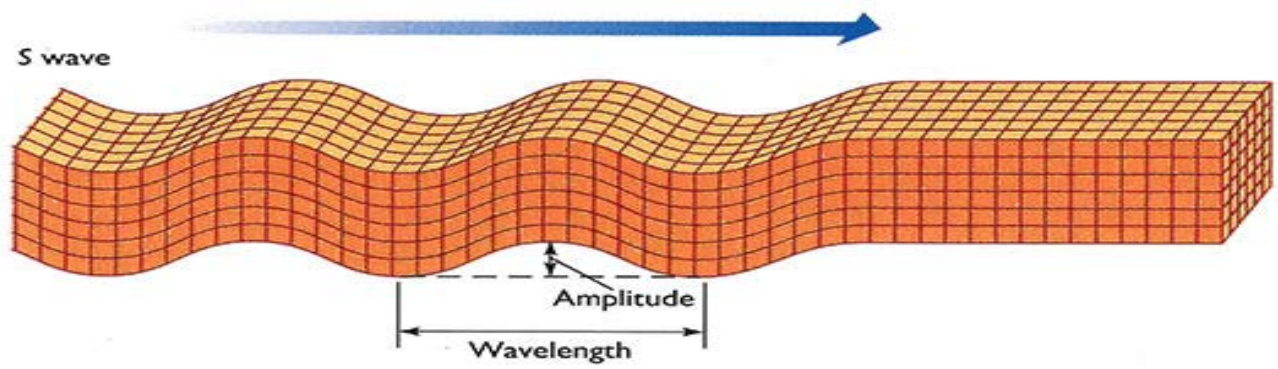
$$(\partial_{tt} - v_s^2 \nabla^2) \underline{Q}(\underline{x}, t) = \underline{\delta}_s(\underline{x}, t) \quad \text{Weqn \#5}$$

S-wave velocity: $v_s^2 = \mu / \rho$

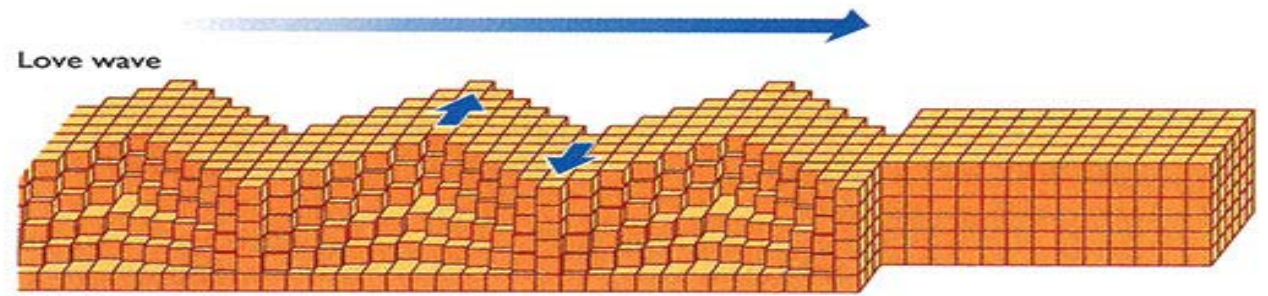
P wave



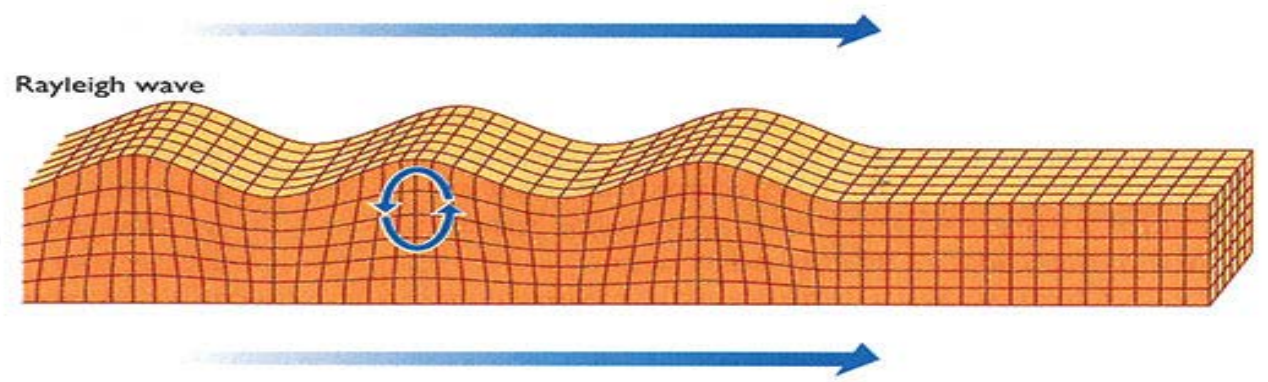
S wave



Love wave

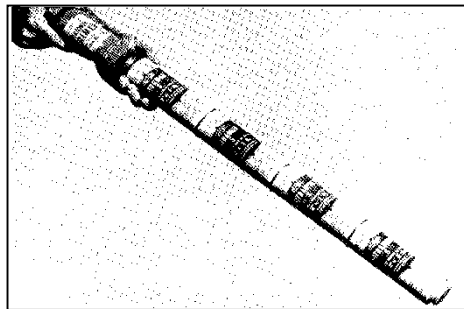


Rayleigh wave

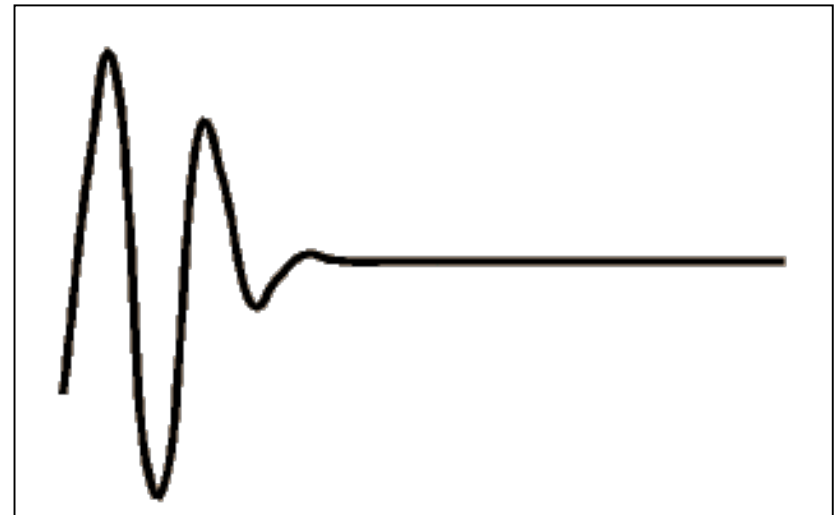


Sources, Sensors, Acquisition geometry

land sources - dynamite



“impulsive” signal



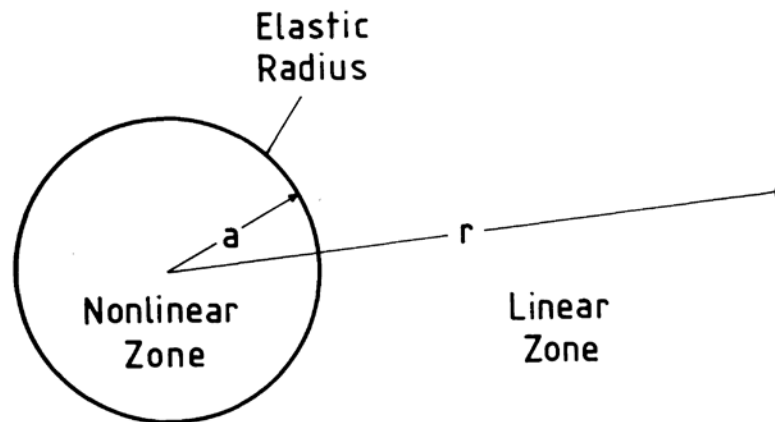
$$s(t) = \sin(\omega t) e^{-at}$$

land sources - dynamite

$$u(r, t) = \frac{1}{r^2} F\left(t - \frac{r}{v}\right) + \frac{1}{r v} F'\left(t - \frac{r}{v}\right); \quad t \geq r/v; r > a$$

near field
 $r < 1$ wavelength

far field
 $r \gg 1$ wavelength



land sources - vibroseis



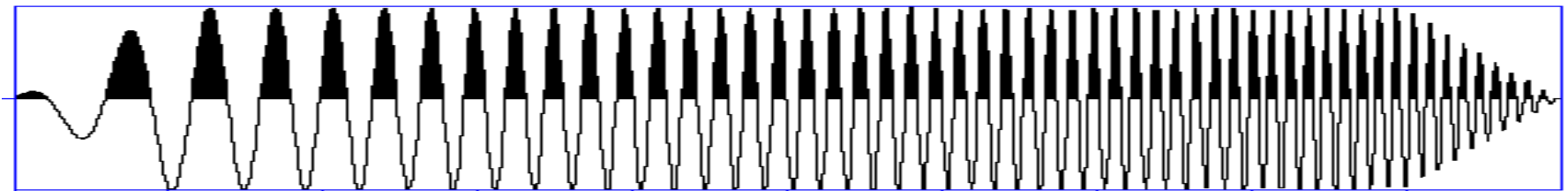
Conoco

$$s(t) = \sin(2\pi f_0 t + \pi k t^2)$$

f_0 = starting frequency

$K = (f_1 - f_0) / t_1 = \text{chirp rate}$

“chirp” signal



land source array



Geokinetics

marine sources - airgun



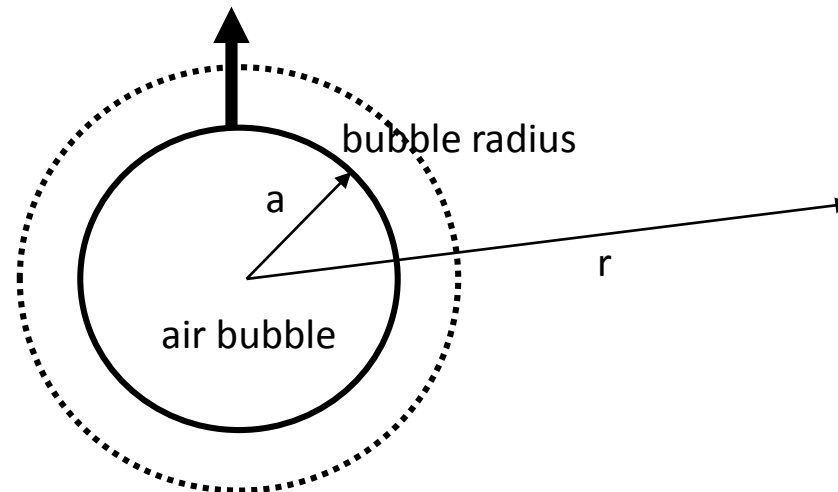
Bolt Technologies

marine sources - airgun

$$u(r, t) = \frac{1}{r^2} F\left(t - \frac{r}{v}\right) + \frac{1}{r v} F'\left(t - \frac{r}{v}\right); \quad t \geq r/v; r > a$$

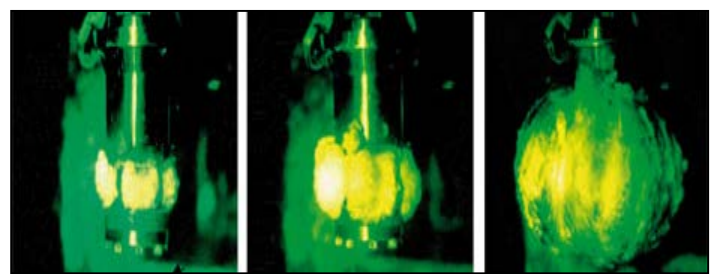
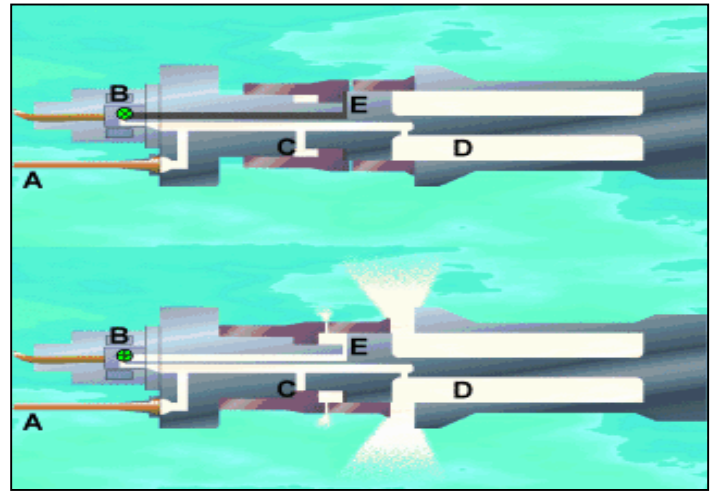
near field
 $r < 1$ wavelength

far field
 $r \gg 1$ wavelength



marine sources - airgun

“impulsive” signal



GeoExpro

air gun array



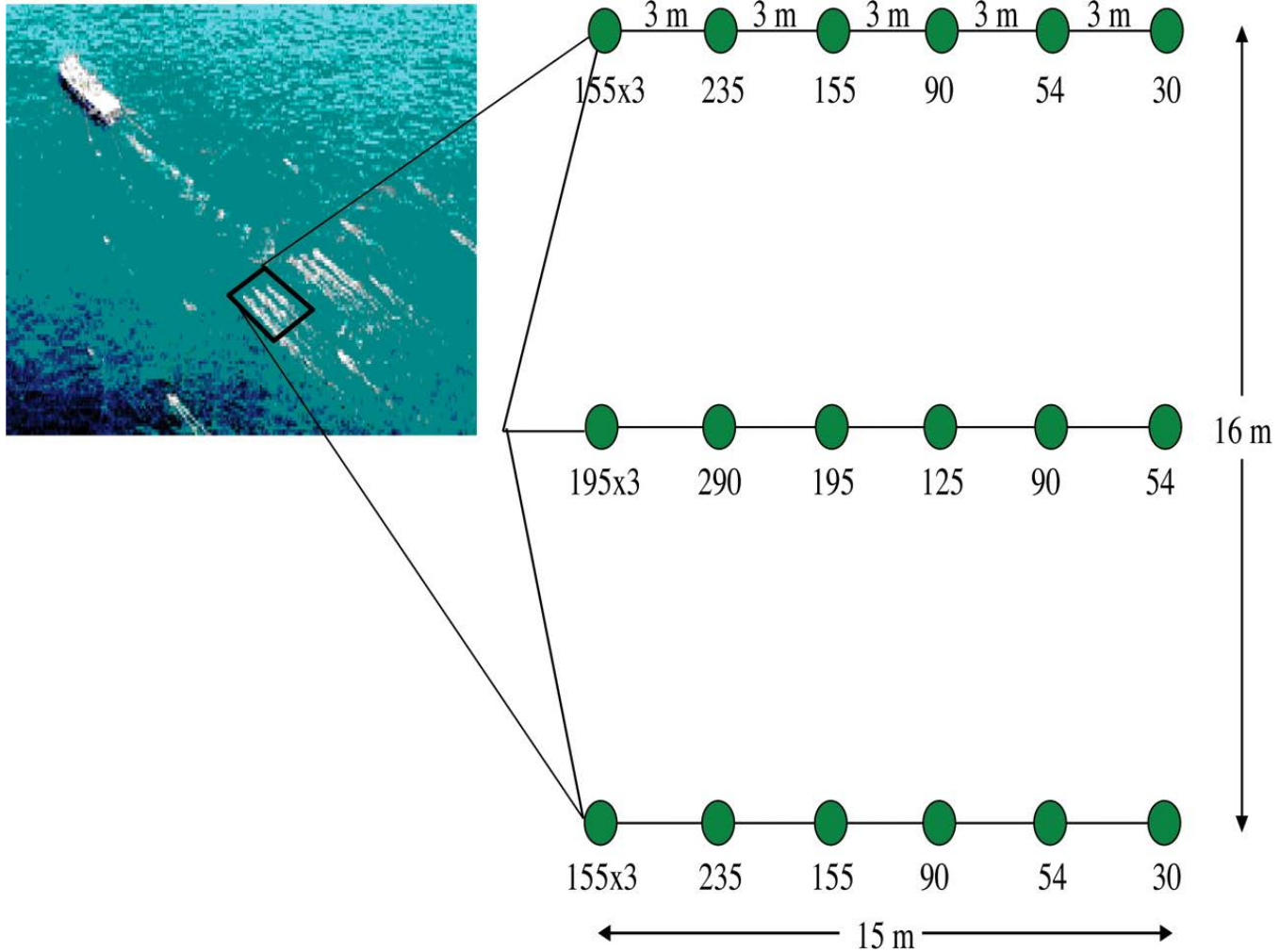
marine airgun array



fugro

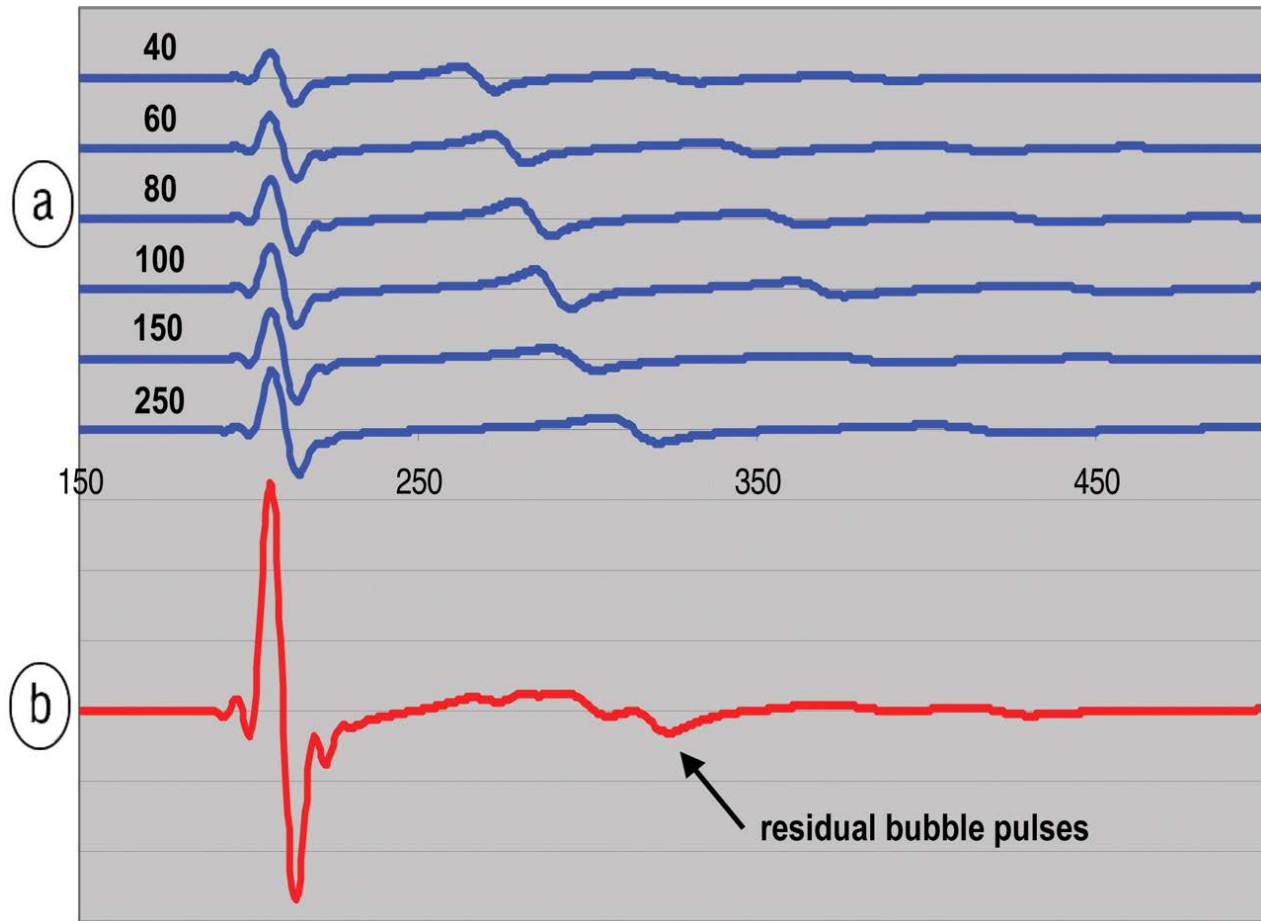
david.lumley@utdallas.edu

marine airgun array



dragoset, TLE, 2000

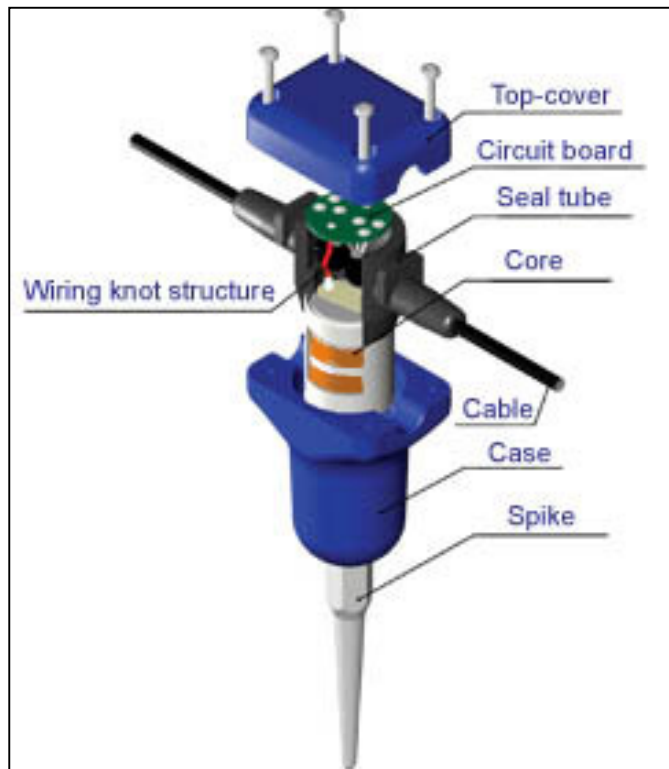
marine airgun array



time (ms)

dragoset, tle 2000

land receivers - geophone



output

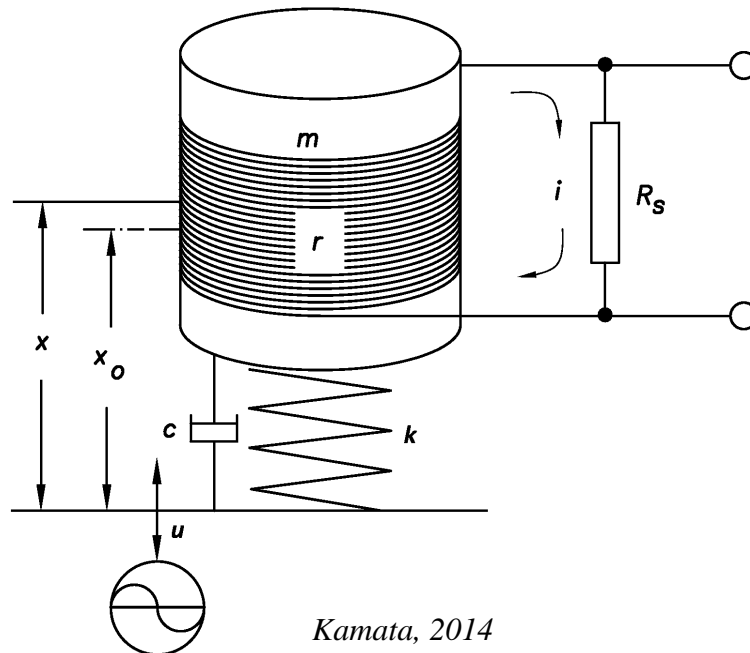


spring-mounted magnet
moving in a coil = voltage
~ particle velocity



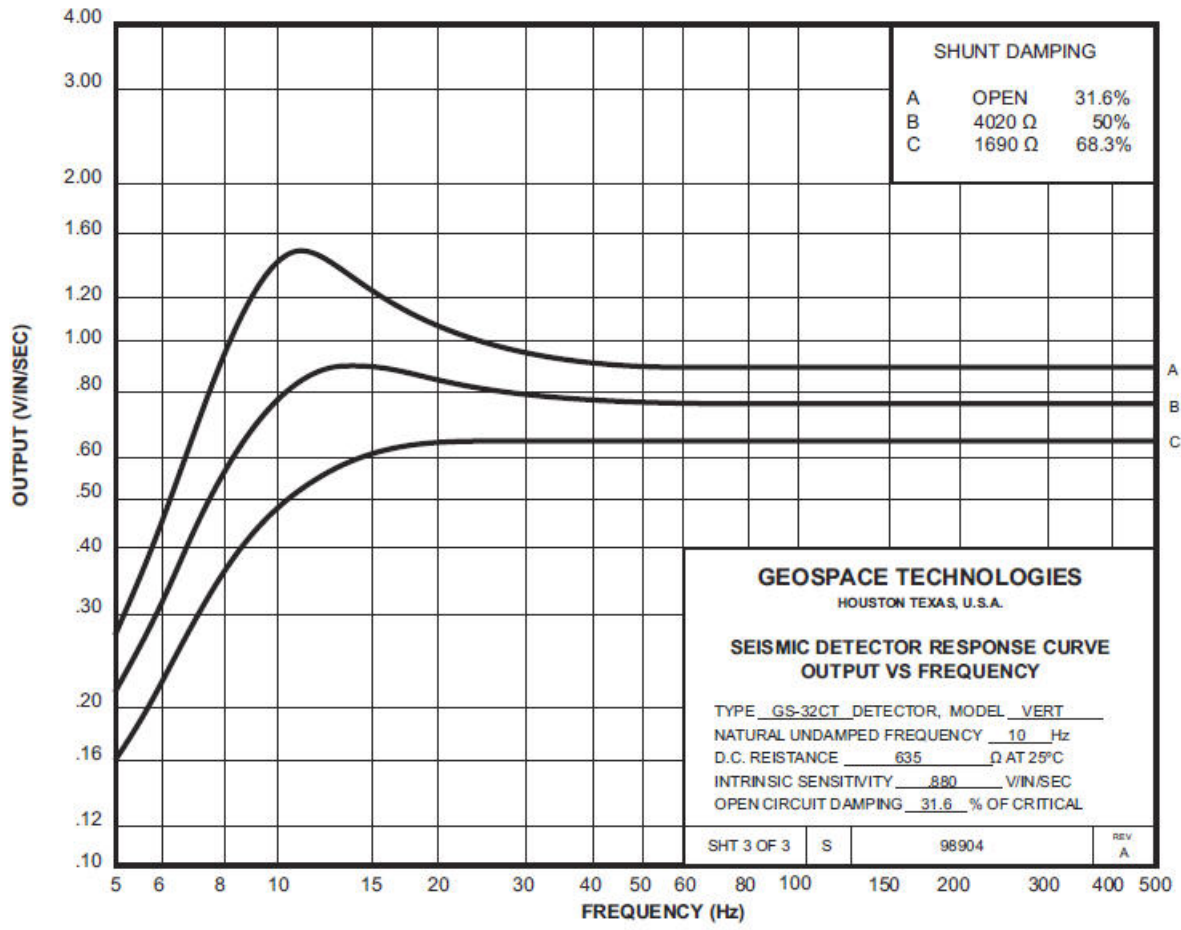
land receivers - geophone

$$e(t) = K/\omega e^{-\sigma(t-t_0)} \sin(\omega(t-t_0)) H(t-t_0) \text{ volts}$$



Kamata, 2014

geophone response



Geospace

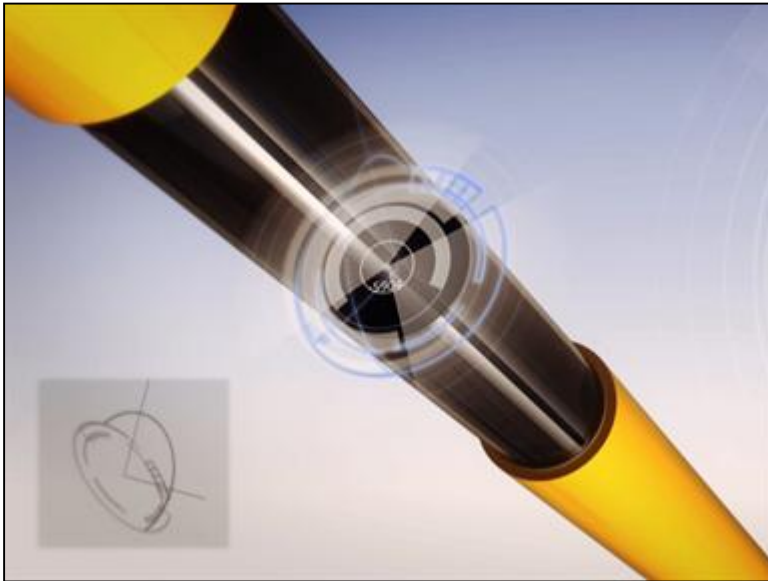
land receiver array



Lumley et al., 2005

marine receivers - hydrophone

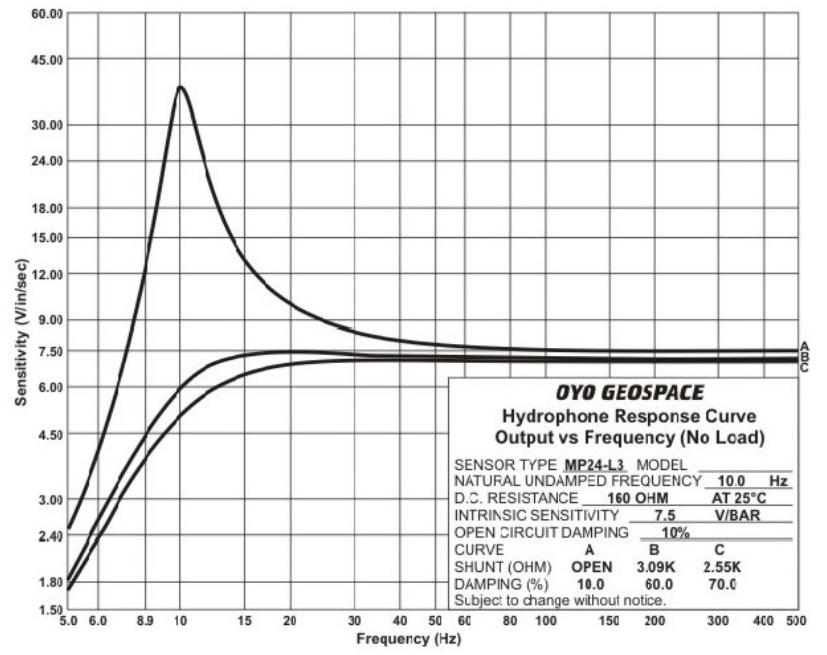
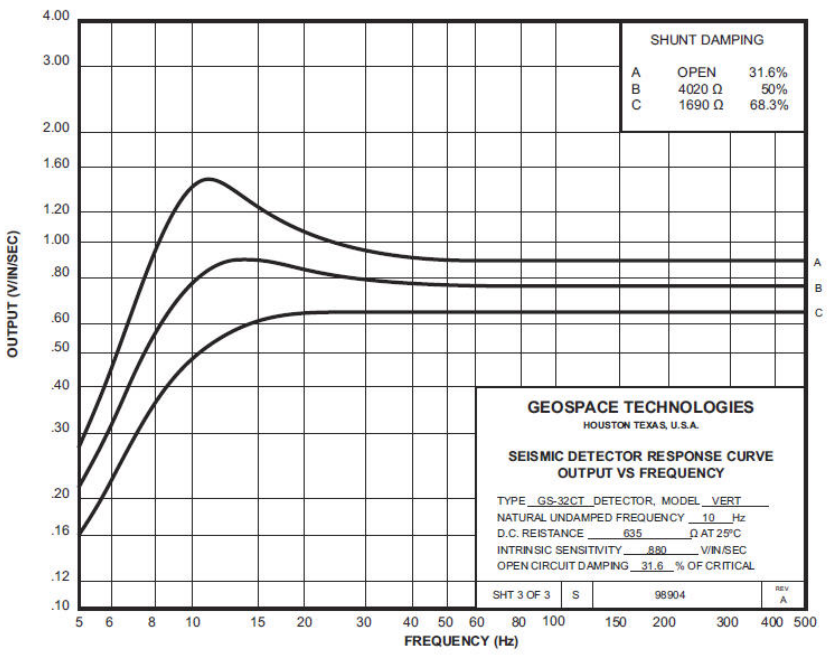
piezoelectric material
generates a voltage when stressed/strained
~ pressure



Sercel



geophone + hydrophone response

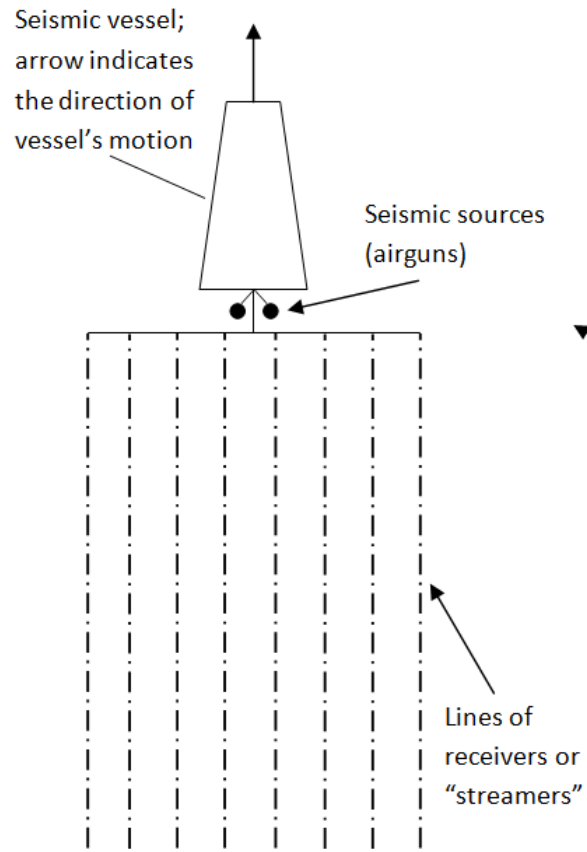


Geospace

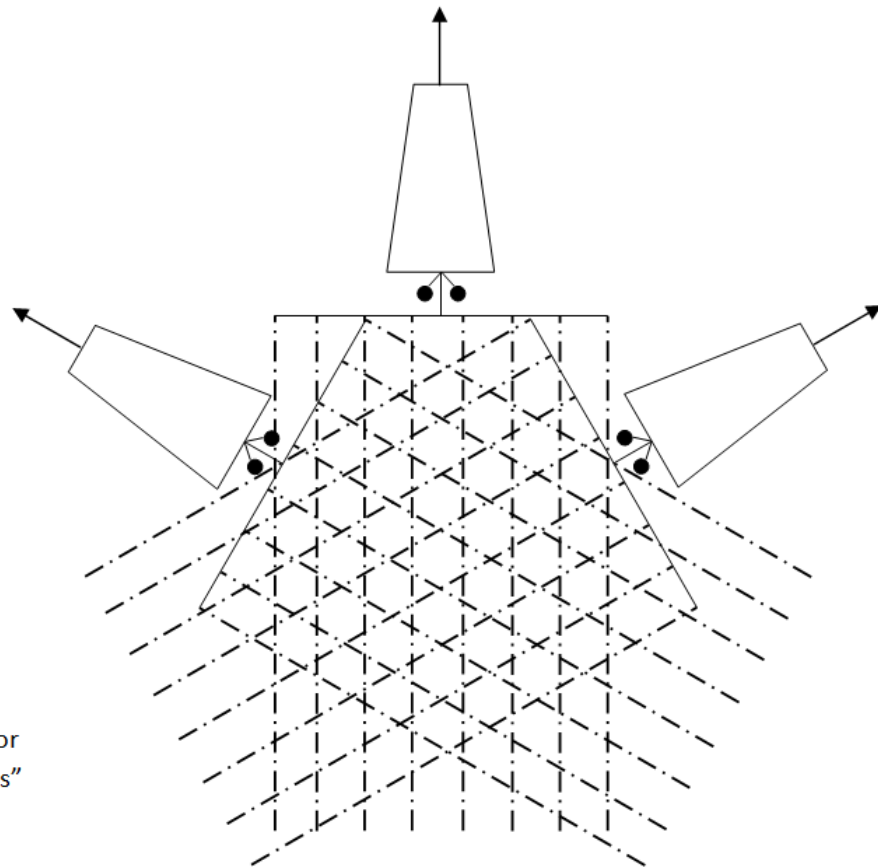
seismic boat – streamer deck



fugro

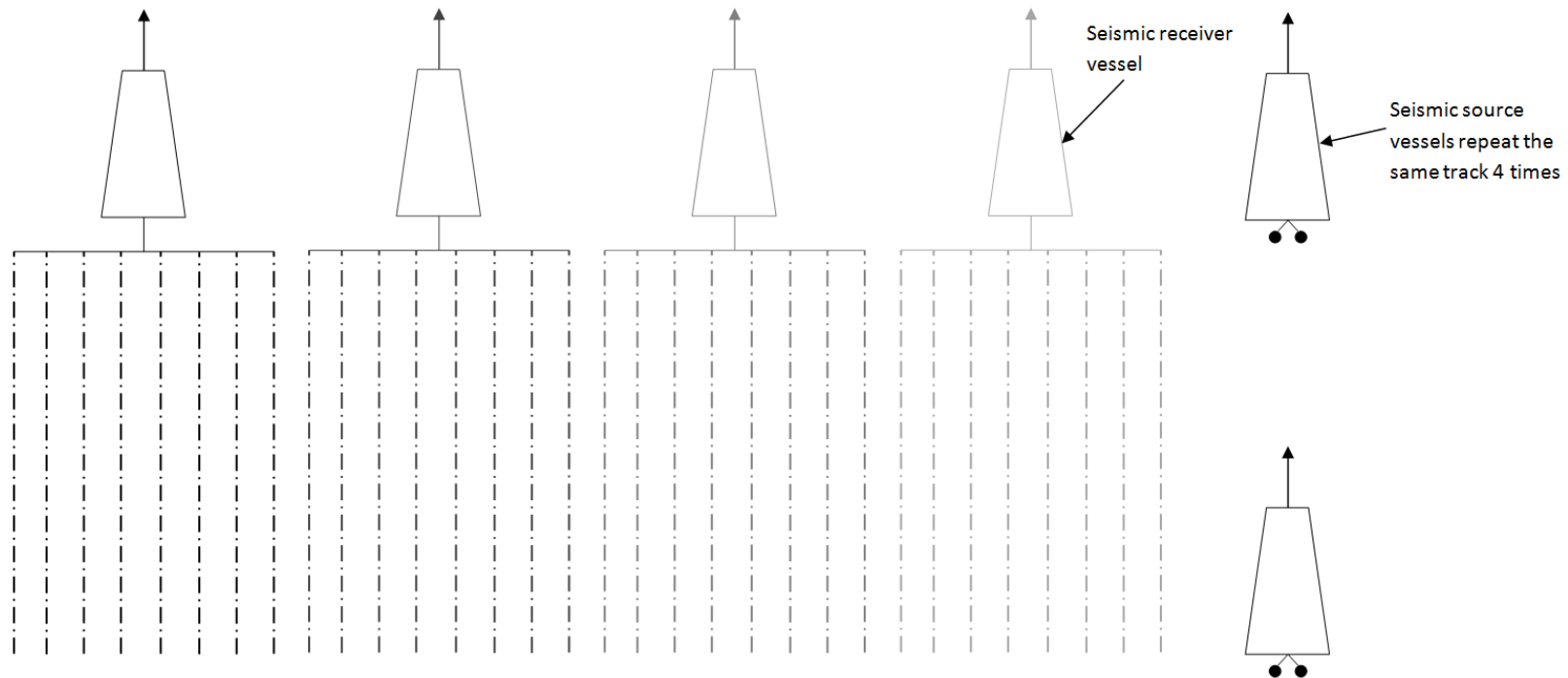


Narrow Azimuth Towed Streamer



Multi-Azimuth Towed Streamer

Wikipedia

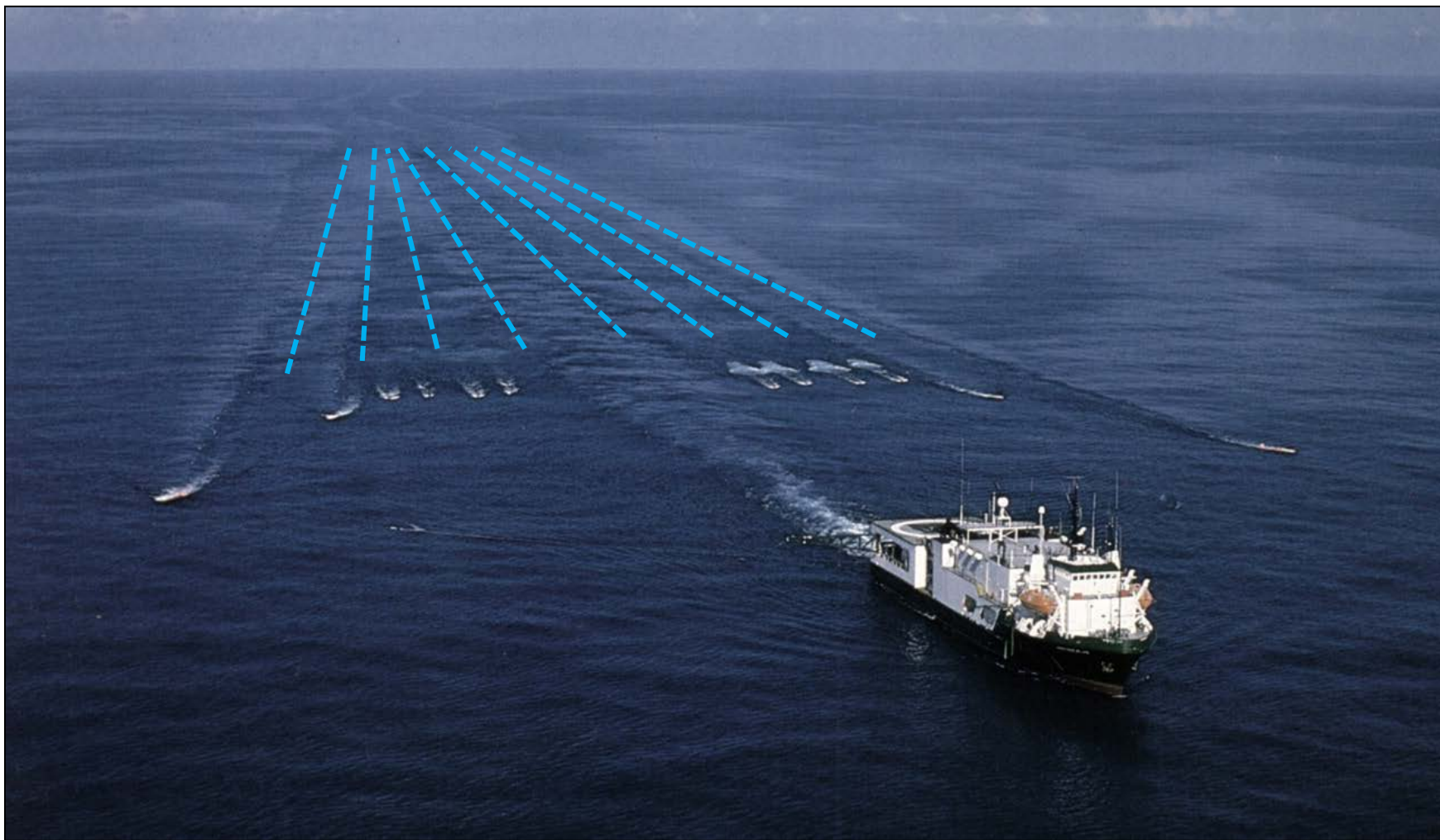


Wide Azimuth Towed Streamer

Seismic receiver vessel repeats 4 parallel tracks to give the effect of a survey with 4 x as many receivers; arrows indicates the direction of each vessel's motion

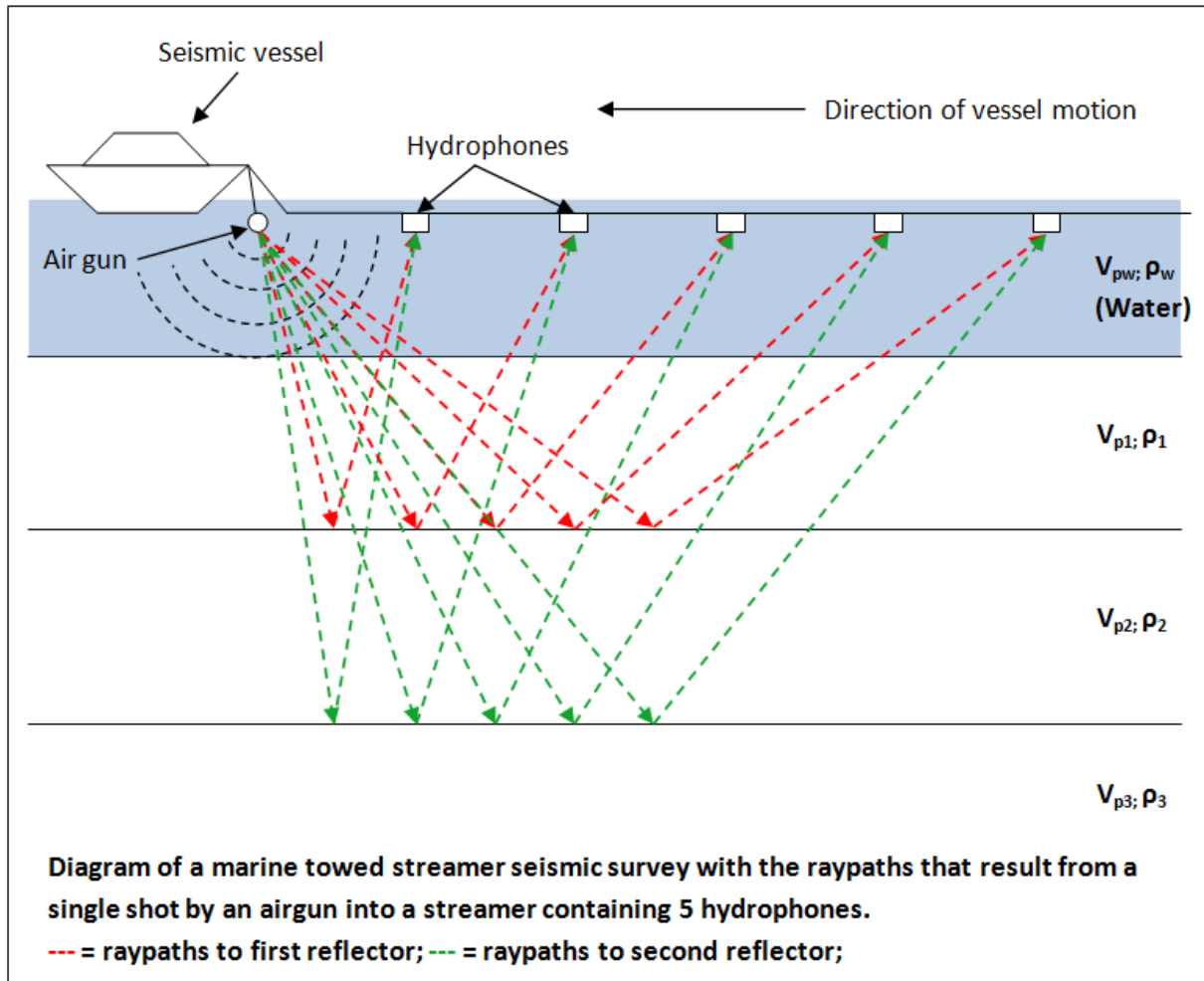
Wikipedia

marine receiver array

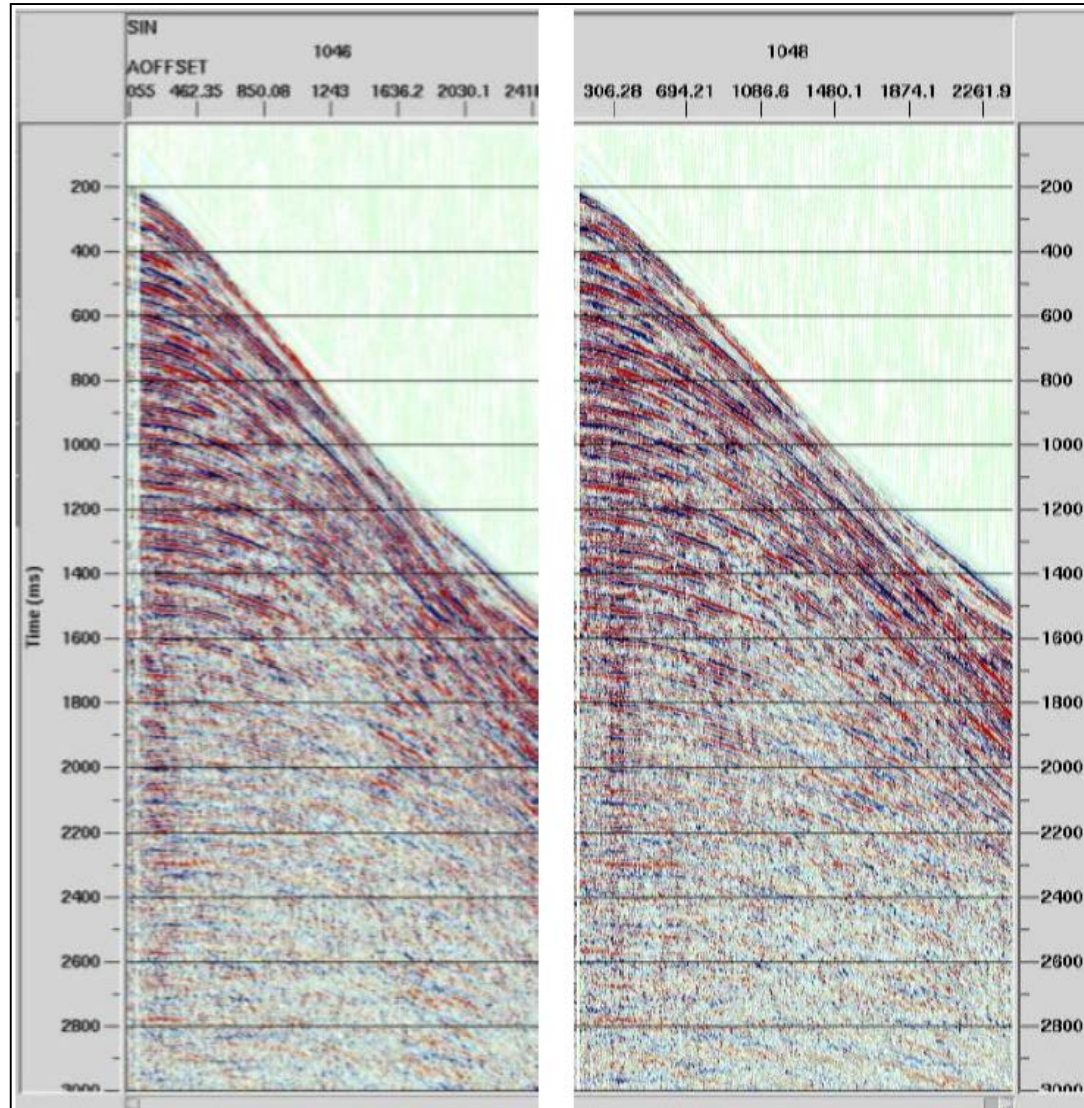


after Dragoset, TLE, 2005

Marine seismic acquisition



real shot gathers



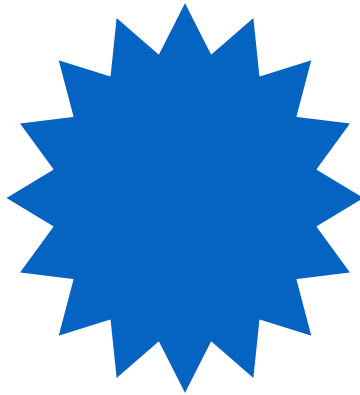
marine vessel processing room



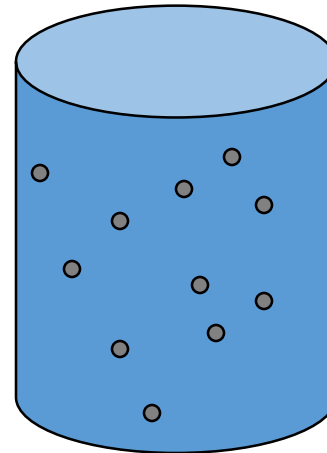
lindsey sharp, fugro

Rock and Fluid Physics

sponge



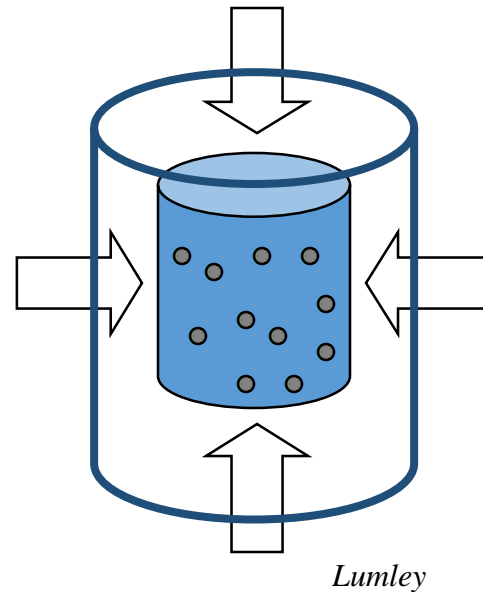
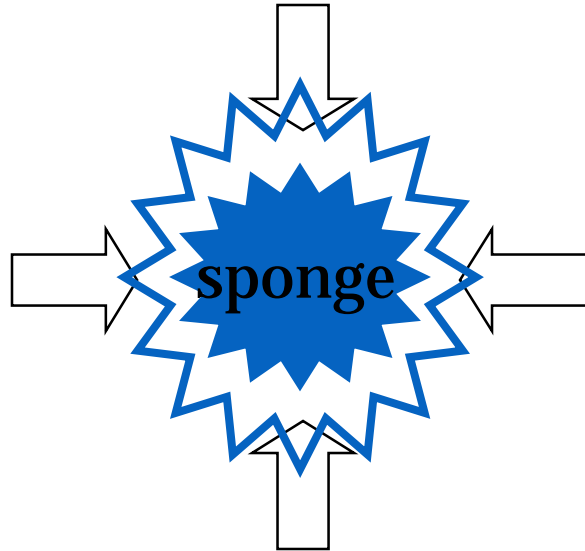
porous rock



Lumley

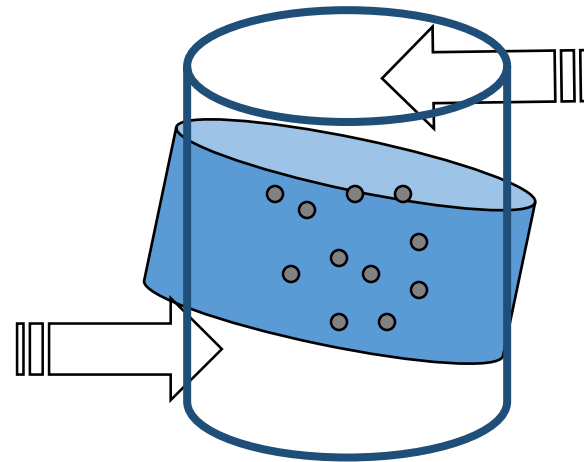
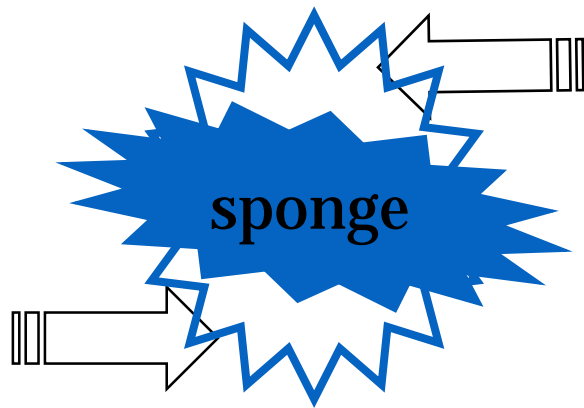
compression

- sensitive to rock compressibility
- sensitive to both pore fluids & pressure



shear

- sensitive to rock shear strength
- sensitive to pore pressure but not fluids



Lumley

seismic velocity and impedance

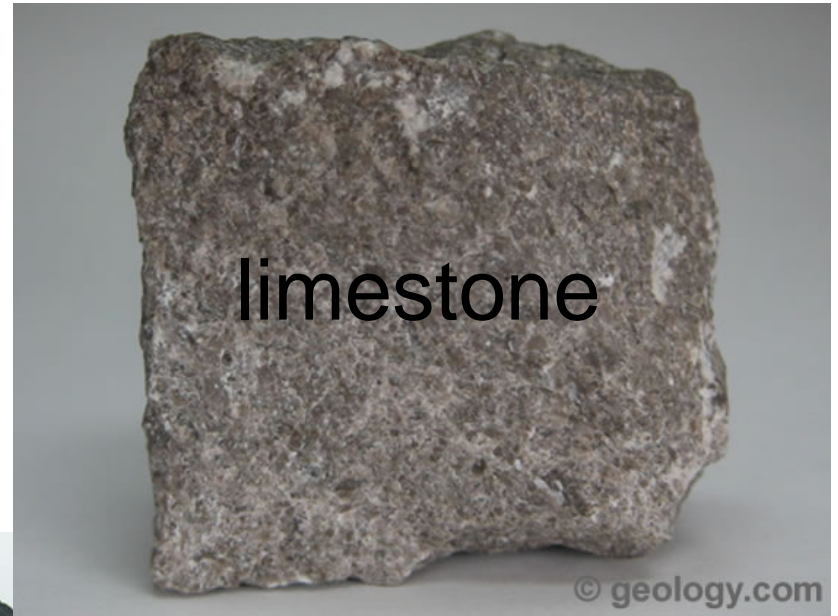
- Two types of velocity: v_p and v_s

- P-waves $v_p = \alpha = \sqrt{(K + 4G/3)/\rho}$
- S-waves $v_s = \beta = \sqrt{G/\rho}$

- **Z = impedance = velocity * density = $v * \rho$**

- $K =$ bulk modulus (stiffness) $= \lambda + 2\mu/3$
- $G =$ shear modulus (shear strength) $= \mu$
- $\rho =$ density

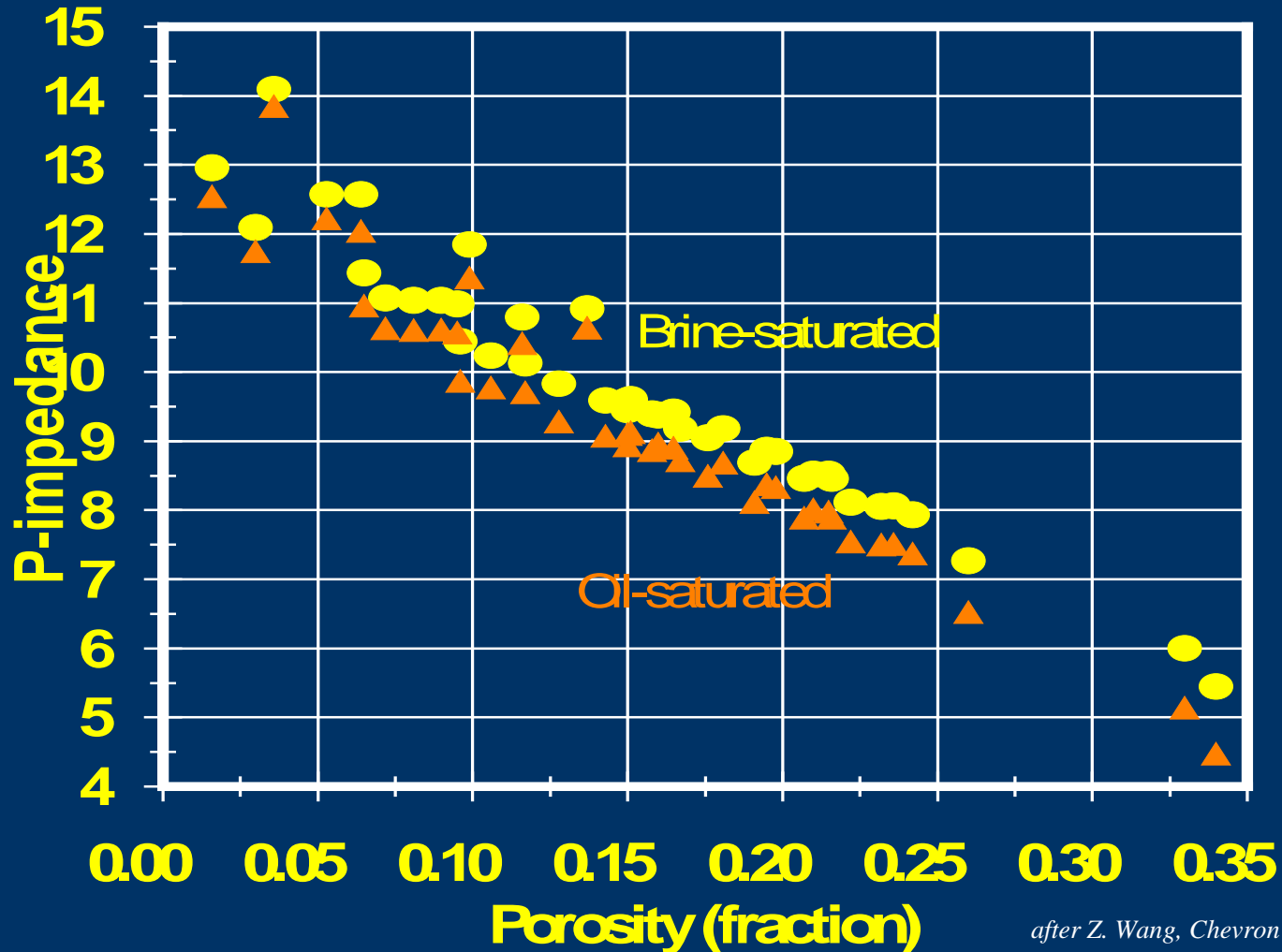
sedimentary rocks



hydrocarbon reservoirs

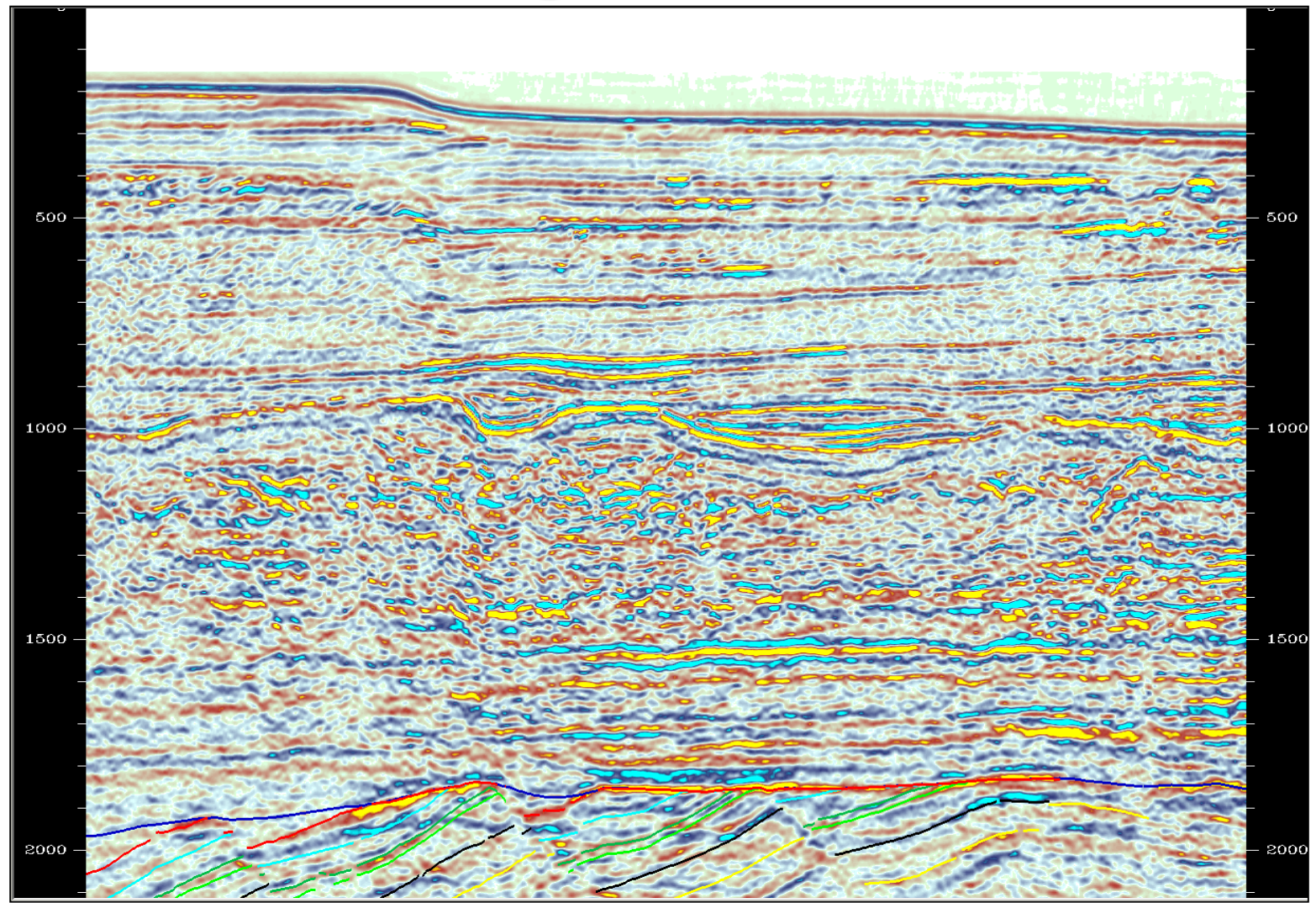
- sediments deposited into oceans
- sediments contain organic material (plant matter)
- buried, compressed and cooked in earth
 - **coal** *formed at low P , low T*
 - **oil** *formed at med P , med T , ie. the “oil window”*
 - **gas** *formed under various P, T conditions*
- rock pores contain fluids (**water**, **oil**, **gas**...)

Gulf Coast and Alaska Sand Samples



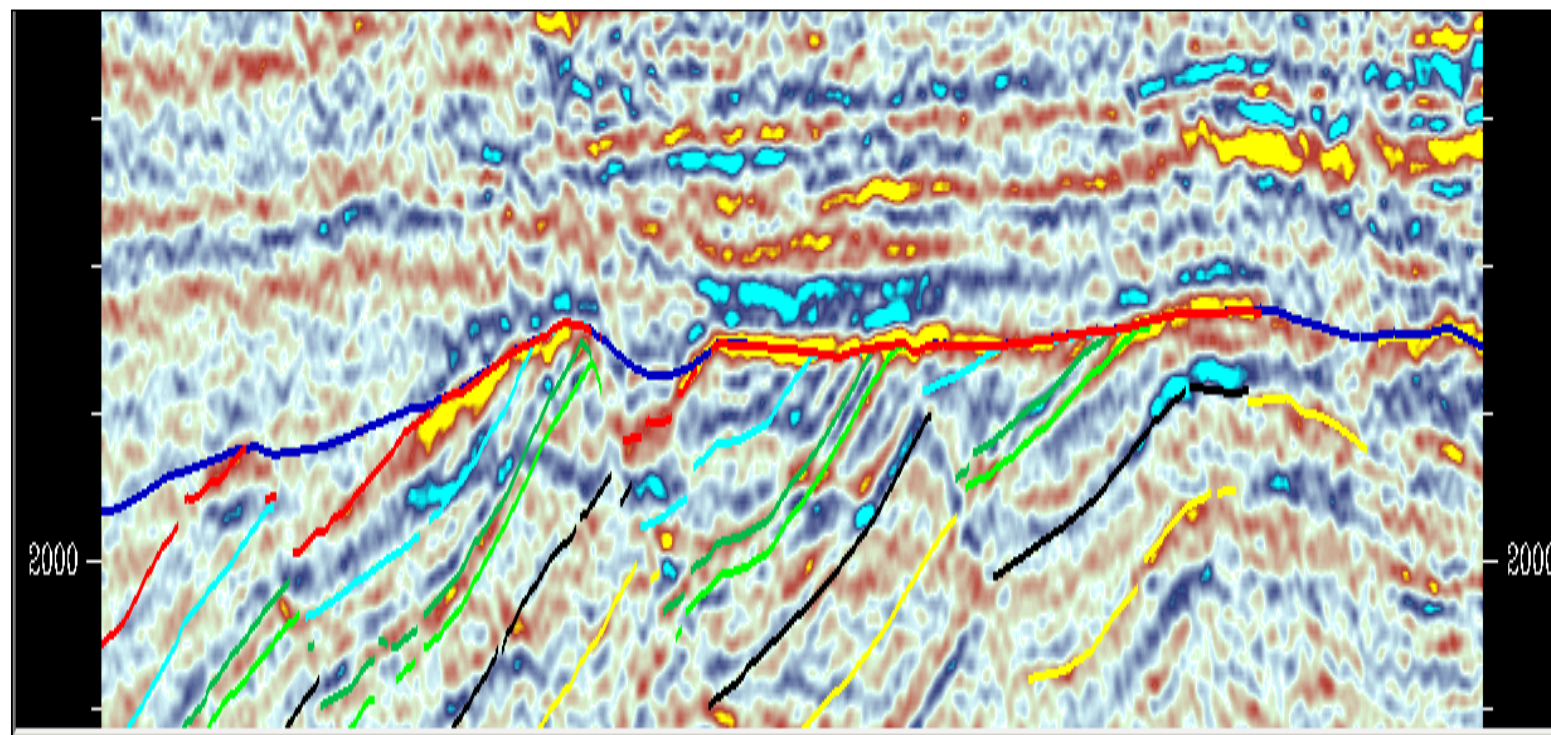
after Z. Wang, Chevron

Seismic Image – 2D cross-section



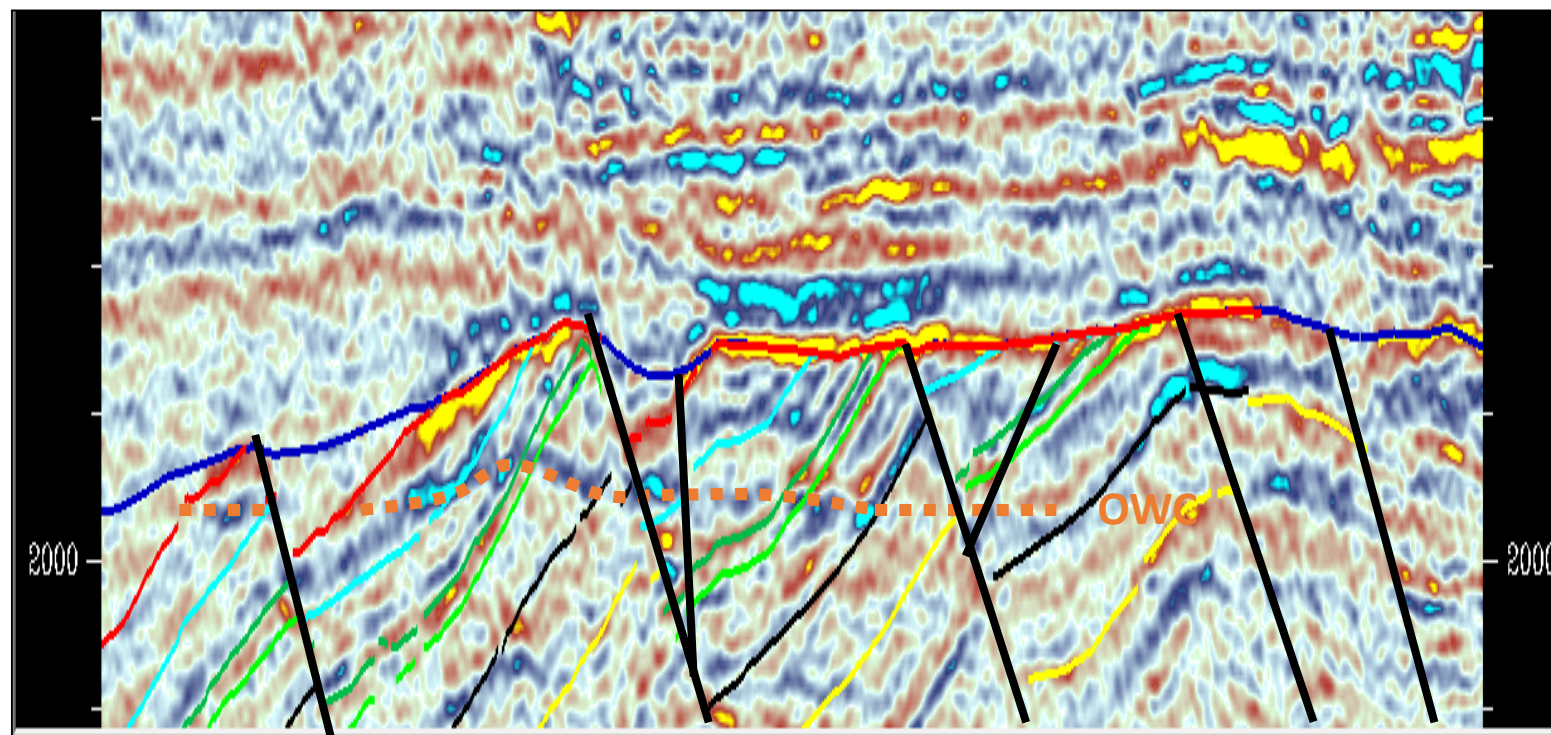
Lumley

Seismic Image – *zoom on reservoirs*



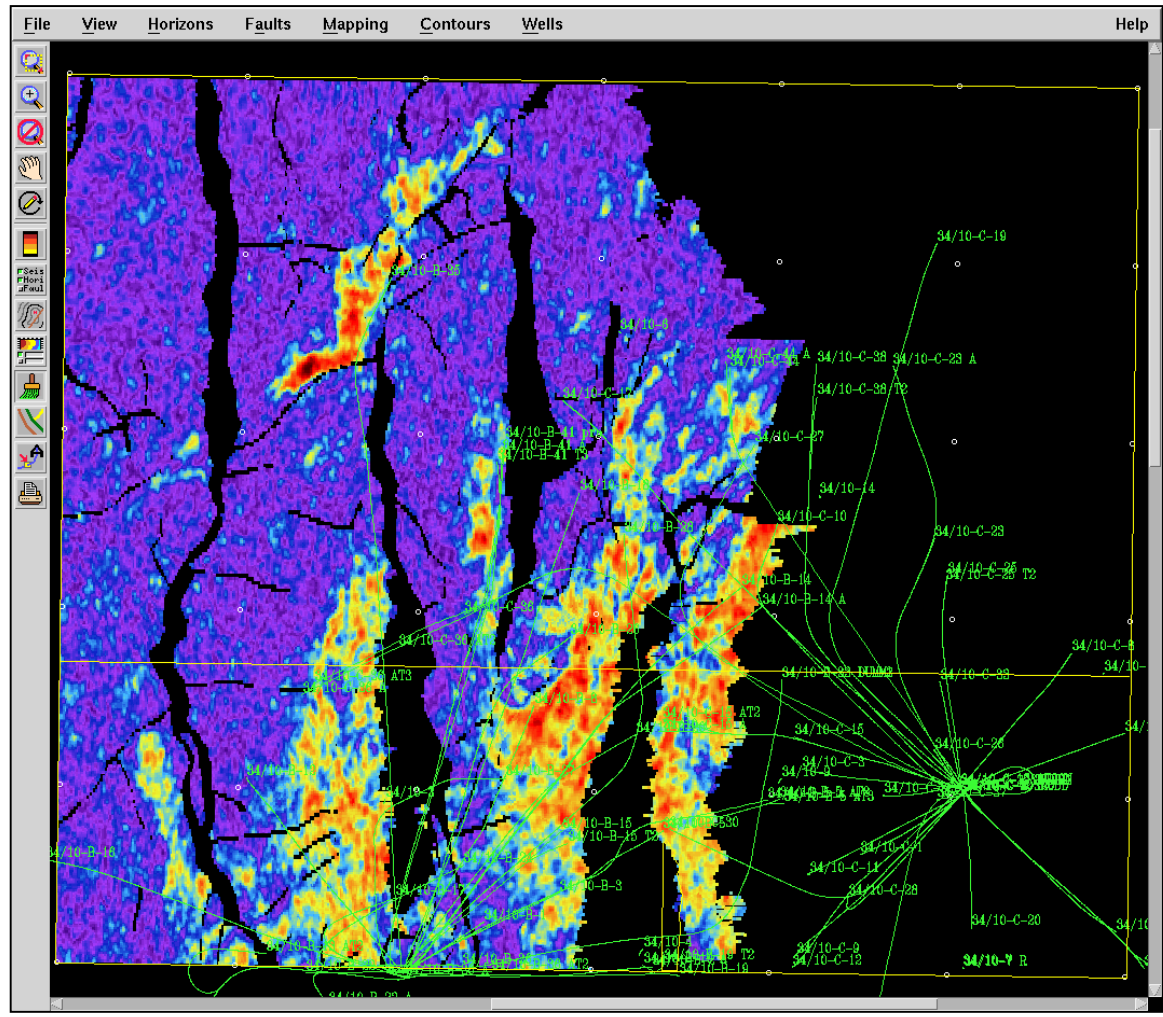
Lumley

Seismic Image – zoom on reservoirs



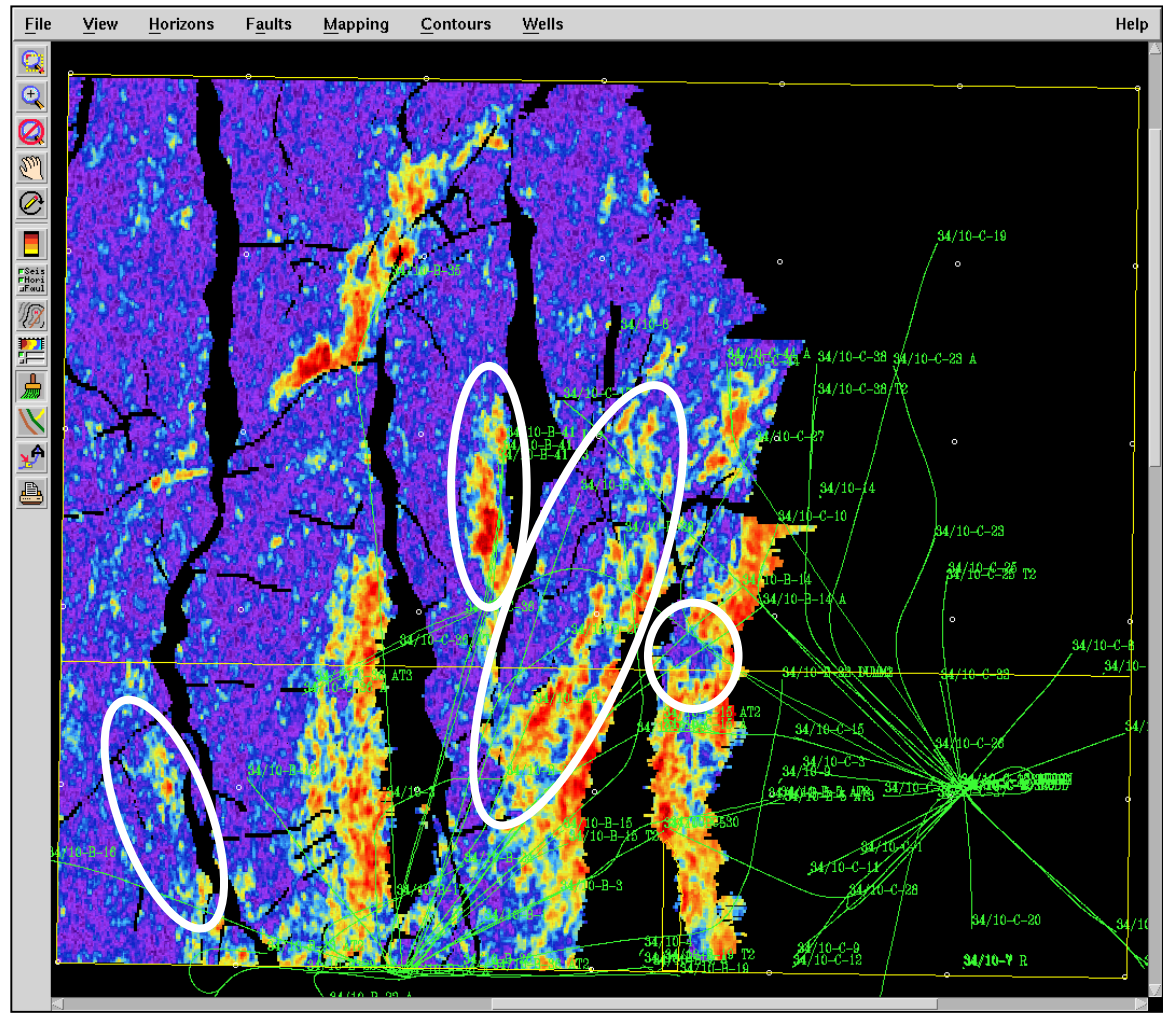
Lumley

Seismic Image – 3D amplitude map extracted along top of reservoir structure



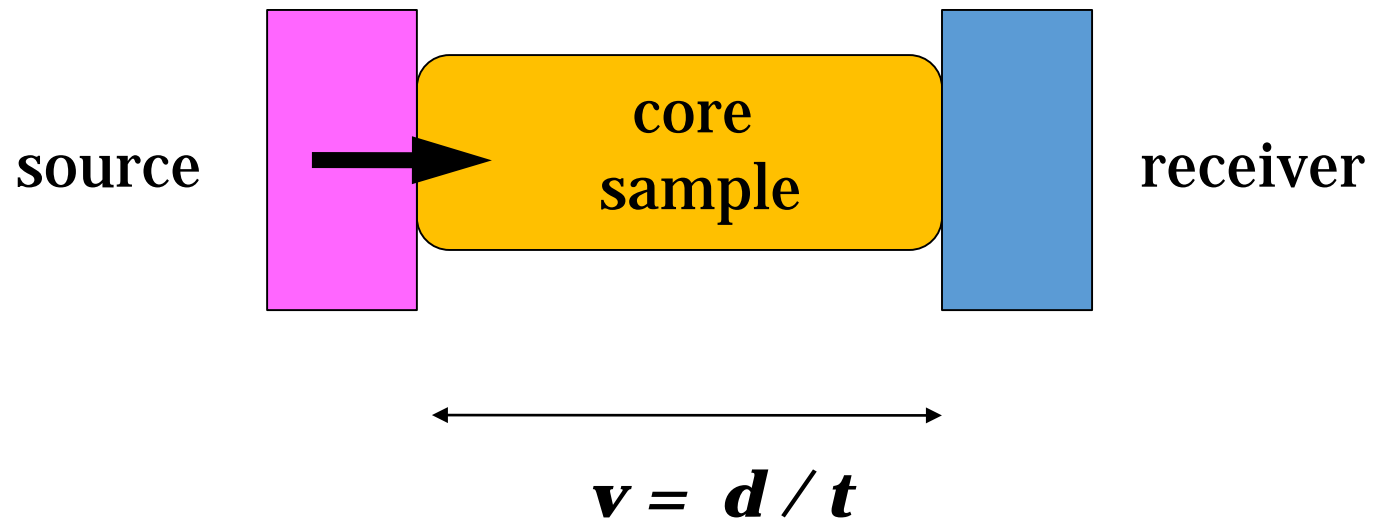
Lumley

Seismic Image – **TIME 2** amplitude map *extracted along top of reservoir structure*

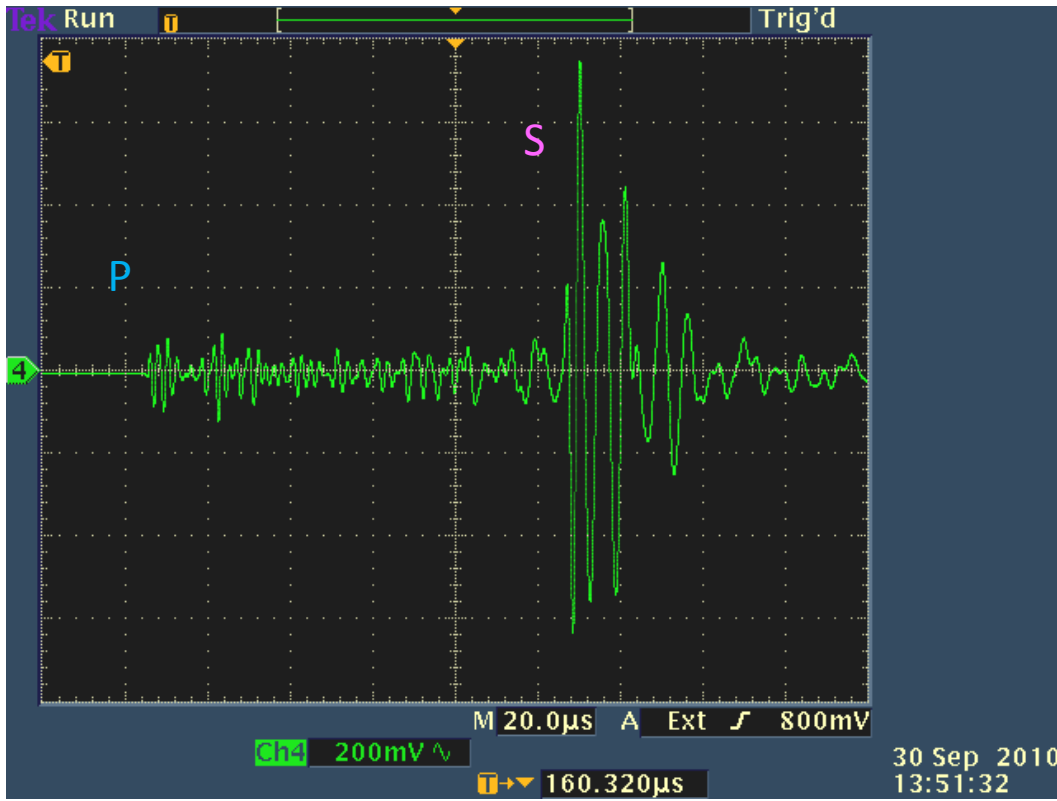


Lumley

Rock Physics core measurements



rock physics lab



M. Lebedev, Curtin

Velocity Equations

$$V_p = \sqrt{\frac{K + \frac{4}{3}G}{\rho}}$$

P-wave velocity

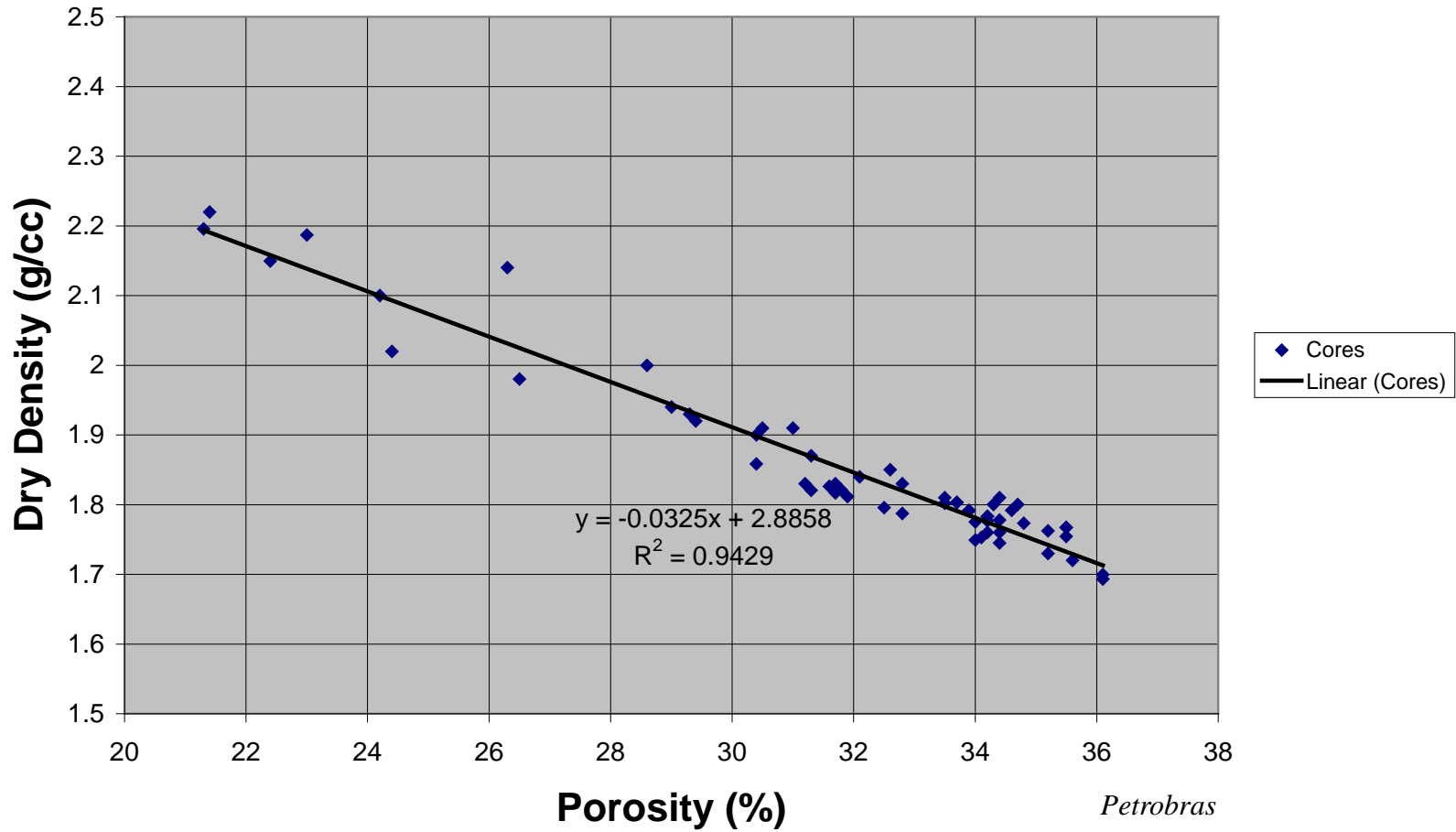
$$V_s = \sqrt{\frac{G}{\rho}}$$

S-wave velocity

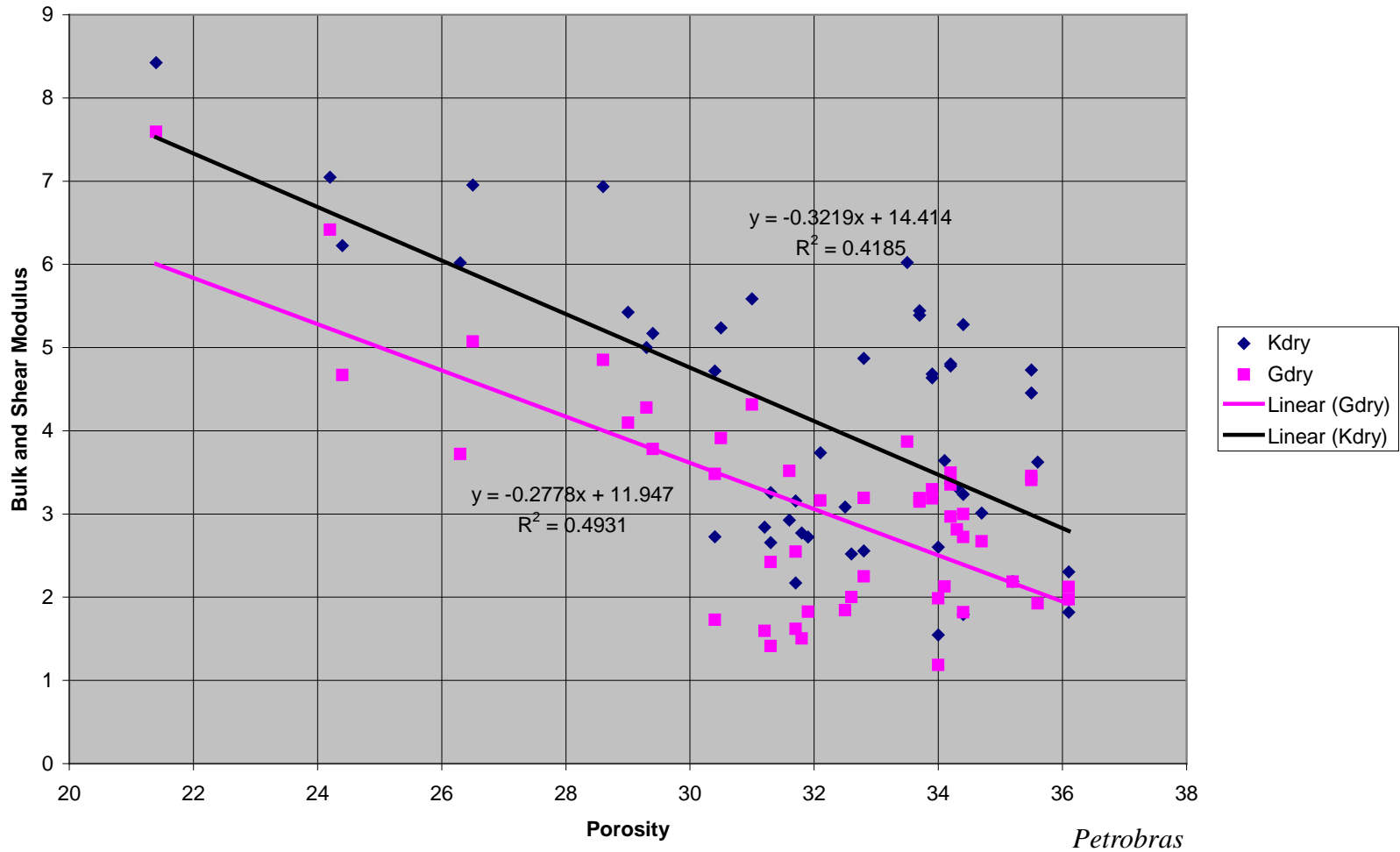
$$I_p = \rho * V_p$$

P-wave impedance

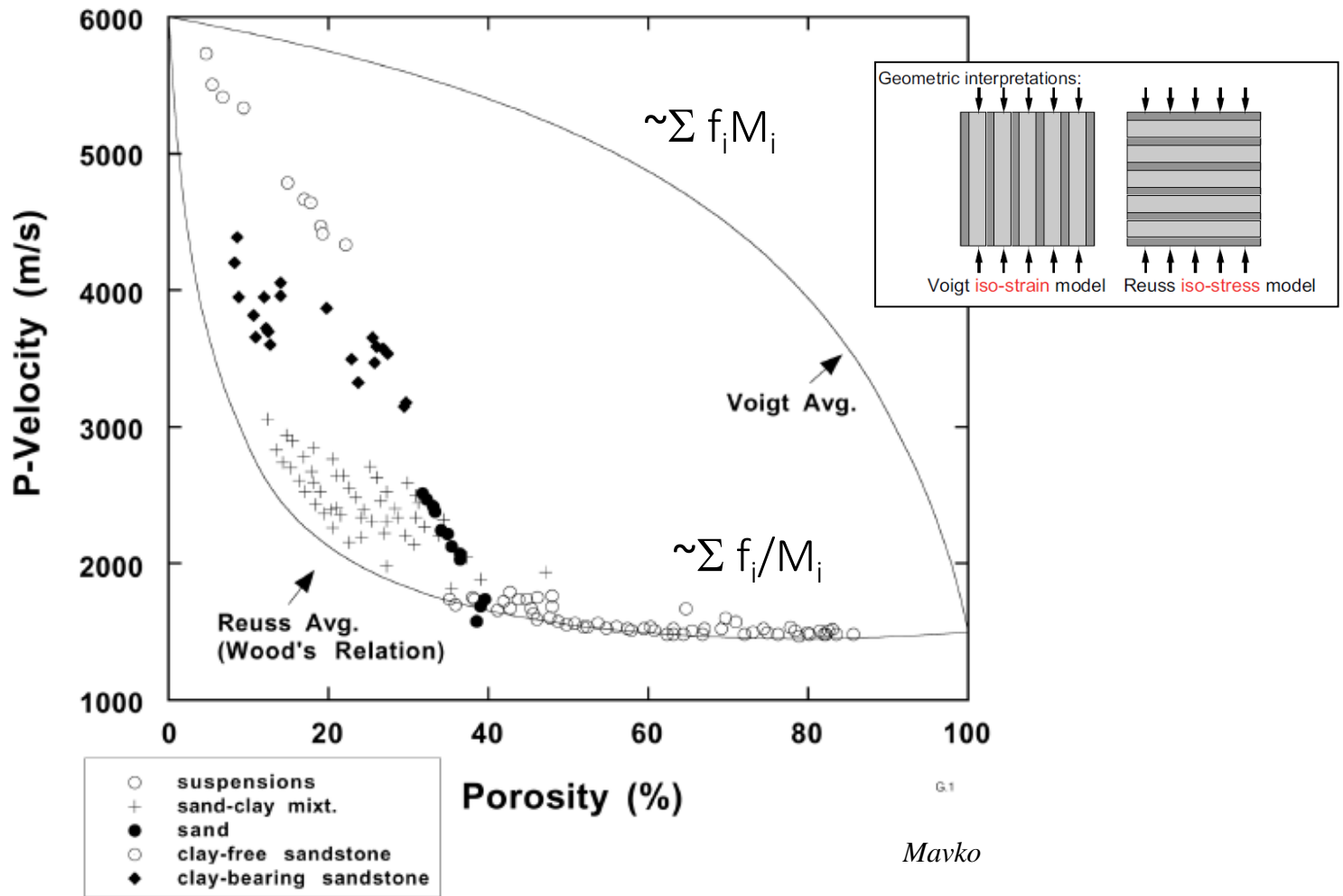
Density versus ϕ



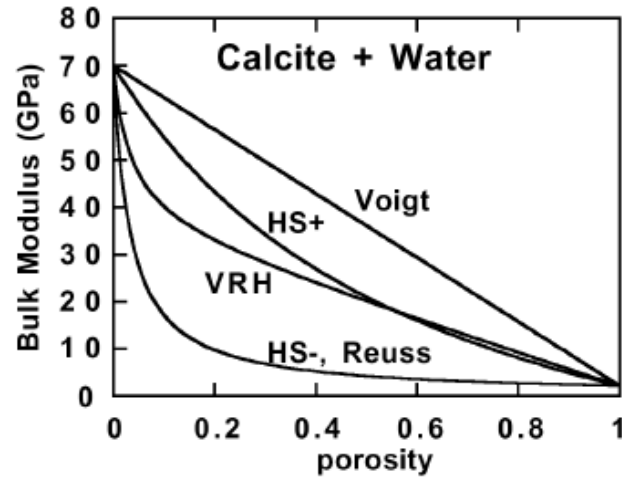
K, G versus ϕ



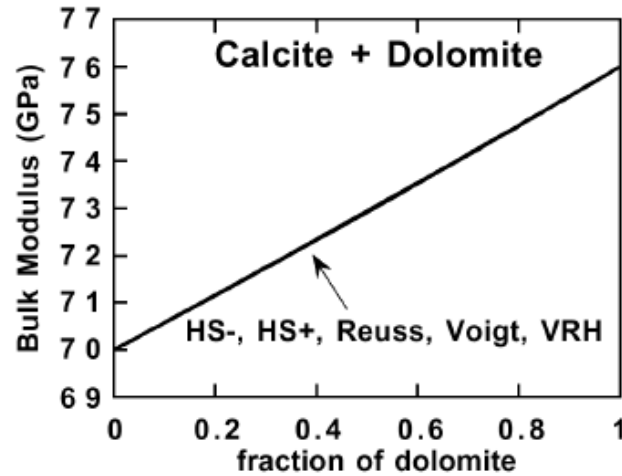
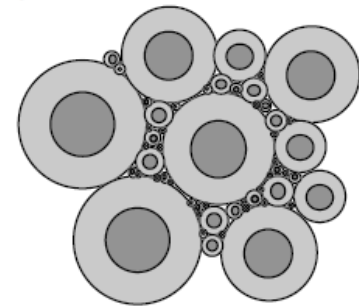
Voigt and Reuss bounds



Hashin-Shtrikman bounds



Interpretation of bulk modulus:



Mavko

Hashin-Shtrikman bounds

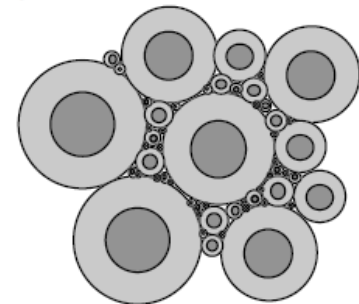
of 2 materials:

$$K^{HS\pm} = K_1 + \frac{f_2}{(K_2 - K_1)^{-1} + f_1 \left(K_1 + \frac{4}{3} \mu_1 \right)^{-1}}$$

$$\mu^{HS\pm} = \mu_1 + \frac{f_2}{(\mu_2 - \mu_1)^{-1} + \frac{2f_1(K_1 + 2\mu_1)}{5\mu_1 \left(K_1 + \frac{4}{3} \mu_1 \right)}}$$

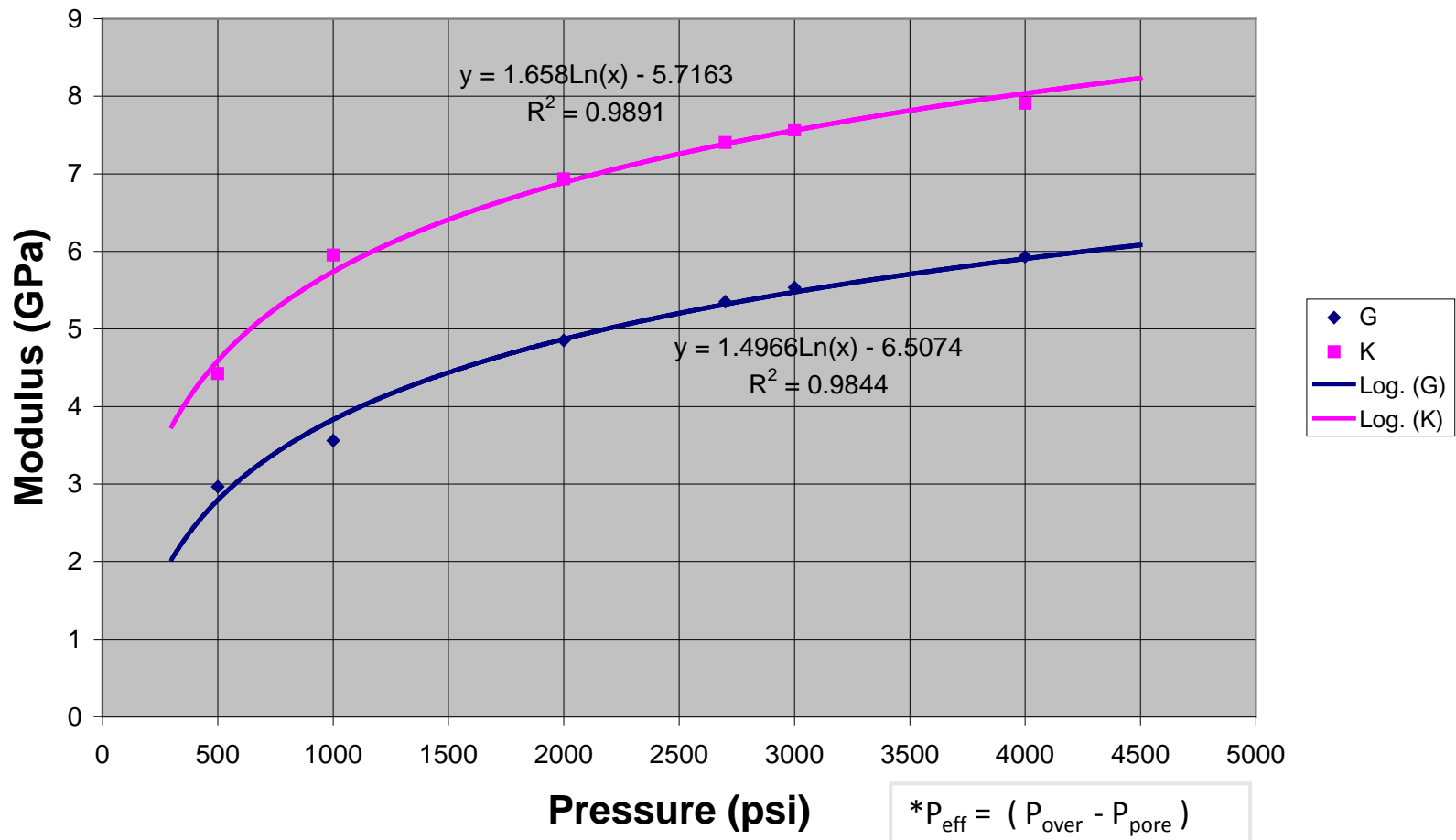
where subscript 1 = shell, 2 = sphere. f_1 and f_2 are volume fractions.

Interpretation of bulk modulus:

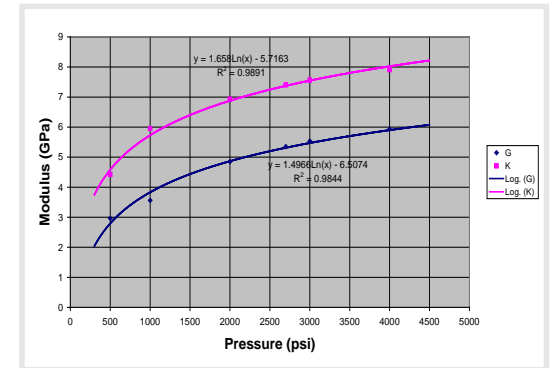


Mavko

K, G versus P_{eff}^*



velocity-pressure curves



- Hertz-Mindlin...

- $K_{dry} = f(c, \varphi_c, K_g, G_g, P_{eff})^{1/3}$
- *theoretical basis, but doesn't fit data in practice*

- Polynomial, Exponential...

- $K_{dry} = c_0 + c_1x + c_2x^2 + \dots + c_nx^n$; c_i coeffs ; $x = P_{eff}$
- $V_{dry} = c_0 + c_1x + c_2 e^{-ax}$; a, c_i coeffs ; $x = P_{eff}$
- *Exponential fits data better than poly and has some theory basis*

- Logarithmic...

- $K_{dry} = c_0 + c_1 \ln(x)$; c_i coeffs ; $x = P_{eff}$
- *Logarithmic fits data better than above, no theory basis (yet)...*

A new velocity-pressure model

$$K = A - B e^{-C P_{eff}} - D e^{-E P_{eff}}$$

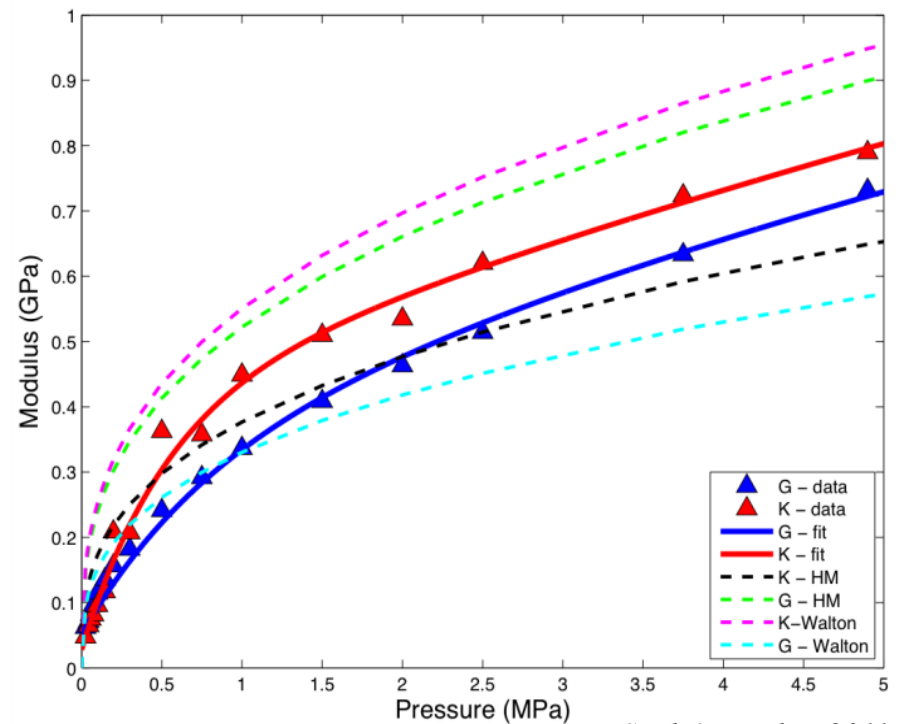
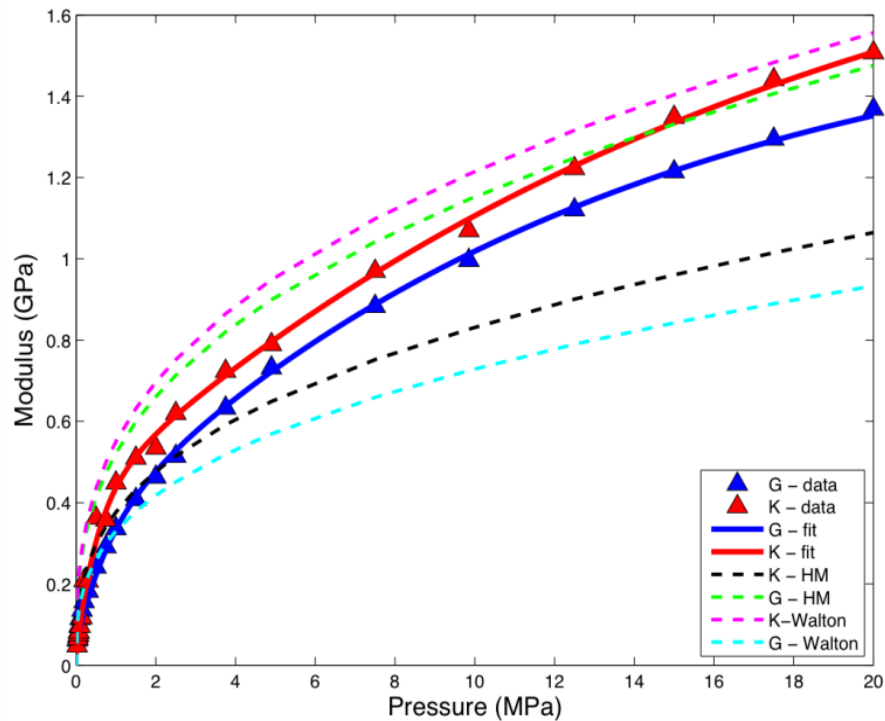
Saul & Lumley, GJI 2013

Where A, B, C, D and E are all positive constants,
with the constraint:

(A-B-D) = K(P_{eff}=0) calculated from:
$$K_{eff} = \left[\frac{\phi_c}{K_f} + \frac{1 - \phi_c}{K_m} \right]^{-1}$$

Fit to core data...

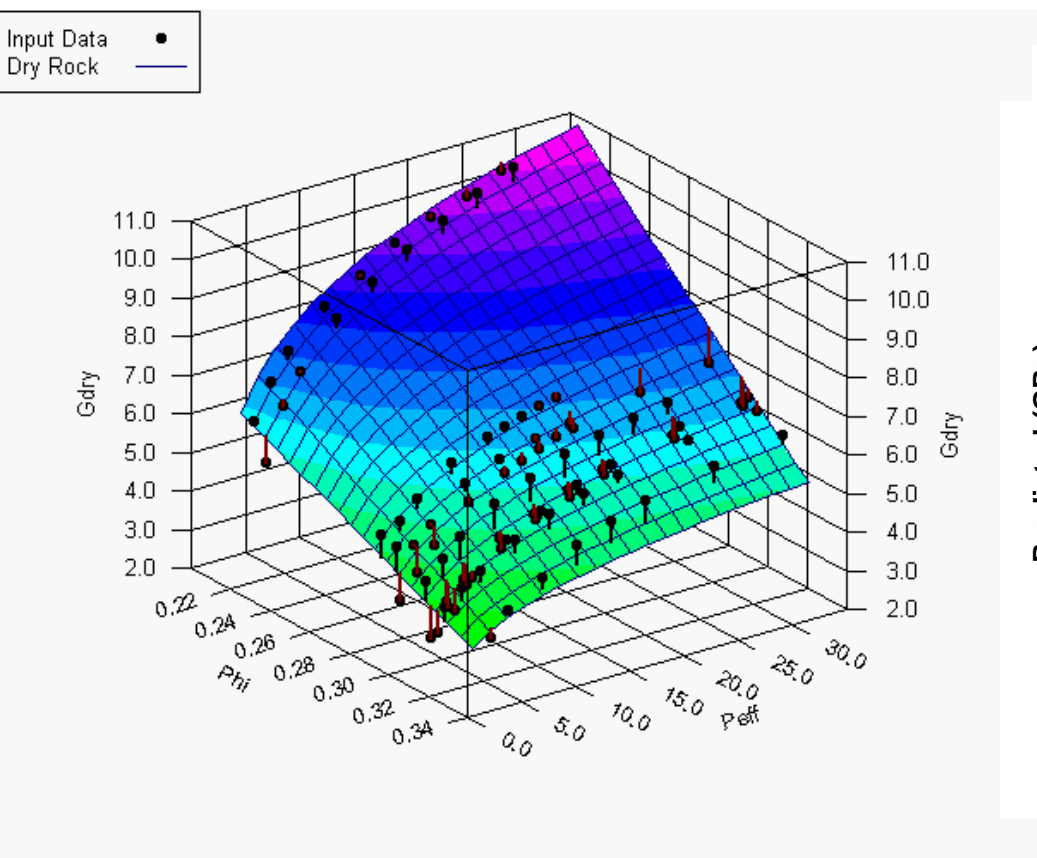
Bulk and Shear moduli – SL, HM, Walton smooth



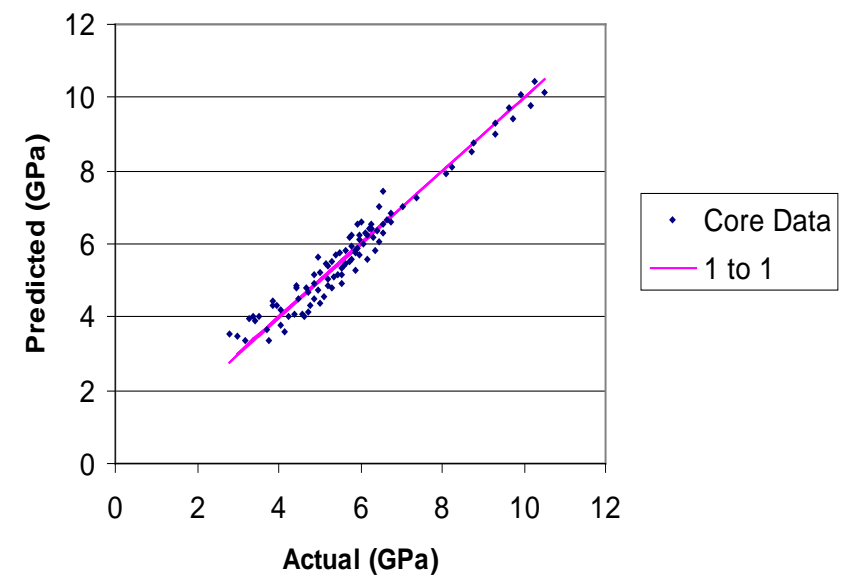
Saul & Lumley, 2011

For Contact models - ϕ_c variable, $C = 20 - 34 \phi + 14 \phi^2$ (Murphey, 1982), $\alpha = 0,1$

2D surface fit for $G_{dry}(f, P_{eff})$



Shear Modulus (log)
Schiehallion ($r^2 = 0.952$)



Meadows et al., 2005

Fluid properties vary with P,T

* PVT data; * Empirical, eg. Batzle & Wang (1992); * Equations of State...
 eg. Span-Wagner, GERG-2004 etc.

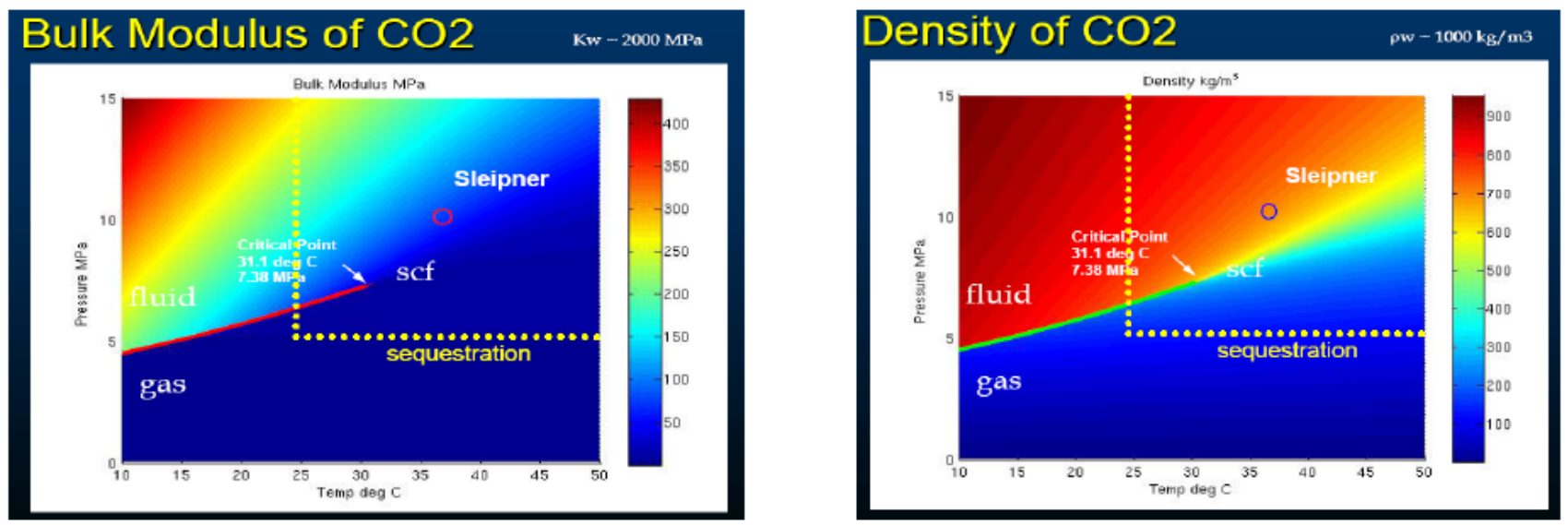


Figure 1: (a) Bulk modulus (left) and (b) density (right) of CO₂ under various pressure and temperature conditions (Lumley et al., 2008).

Lumley

Fluid mixing equations

Wood's equation:

$$1/K_{fluid} = \sum S_i / K_i$$

Effective fluid modulus

S_i is the i^{th} fluid saturation
such that $\sum S_i = 1$

K_i is the i^{th} fluid modulus

ρ_i is the i^{th} fluid density

Note: (S_i/K_i) averaging leads to the Reuss lower bound
 $(S_i * K_i)$ averaging leads to the Voigt upper bound

$$\rho_{sat} = \rho_{dry} + \phi \sum S_i \rho_i$$

Bulk density

Gassmann Equation

Gassmann Equation:

$$K_{sat} = K_{dry} + A/B$$

Saturated bulk modulus

$$A = (1 - K_{dry}/K_m)^2$$

K_m is the matrix (grain) modulus
 ϕ is the porosity
 K_{fluid} is the effective fluid modulus

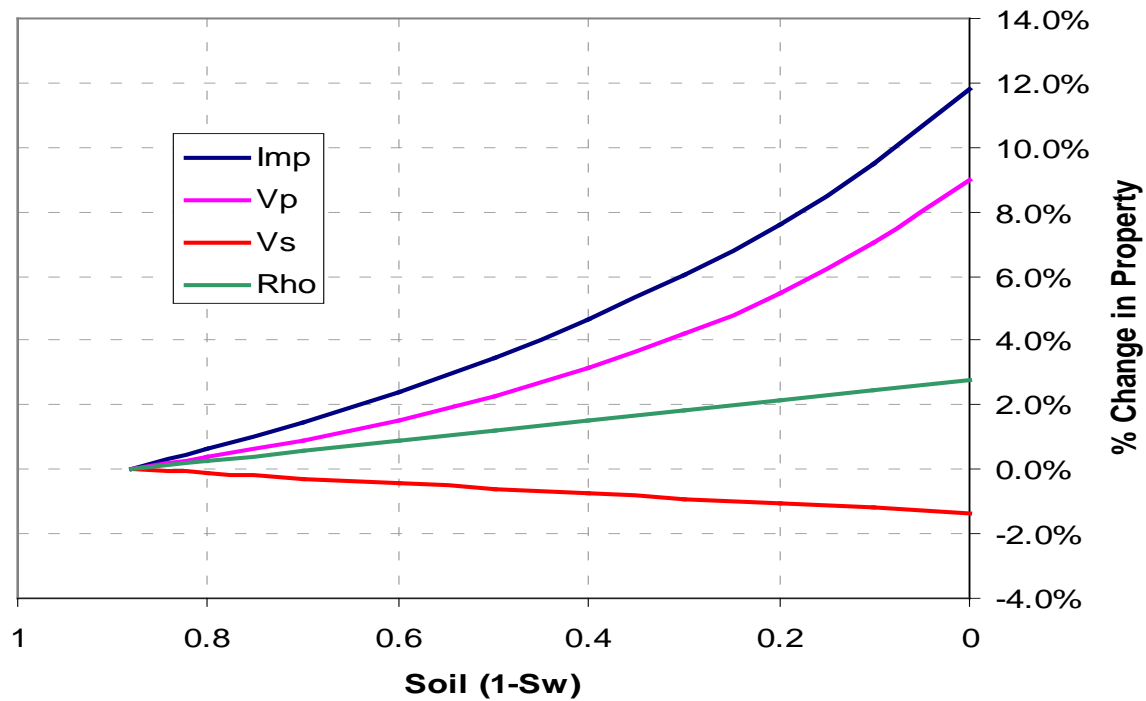
$$B = \frac{\phi}{K_{fluid}} + \frac{1 - \phi}{K_m} - \frac{K_{dry}}{(K_m)^2}$$

$$G_{sat} = G_{dry}$$

Shear modulus

Velocity-saturation curves

Change in Seismic Properties with Water Flooding
Constant Pore Pressure



Lumley et al.

Patchy Saturation

Hill's equation:

$$1/M_{patchy} = \sum S_i/M_i$$

Patchy rock modulus

S_i is the i^{th} fluid saturation
such that $\sum S_i = 1$

$$M_i = K_{i(sat)} + 4G/3$$

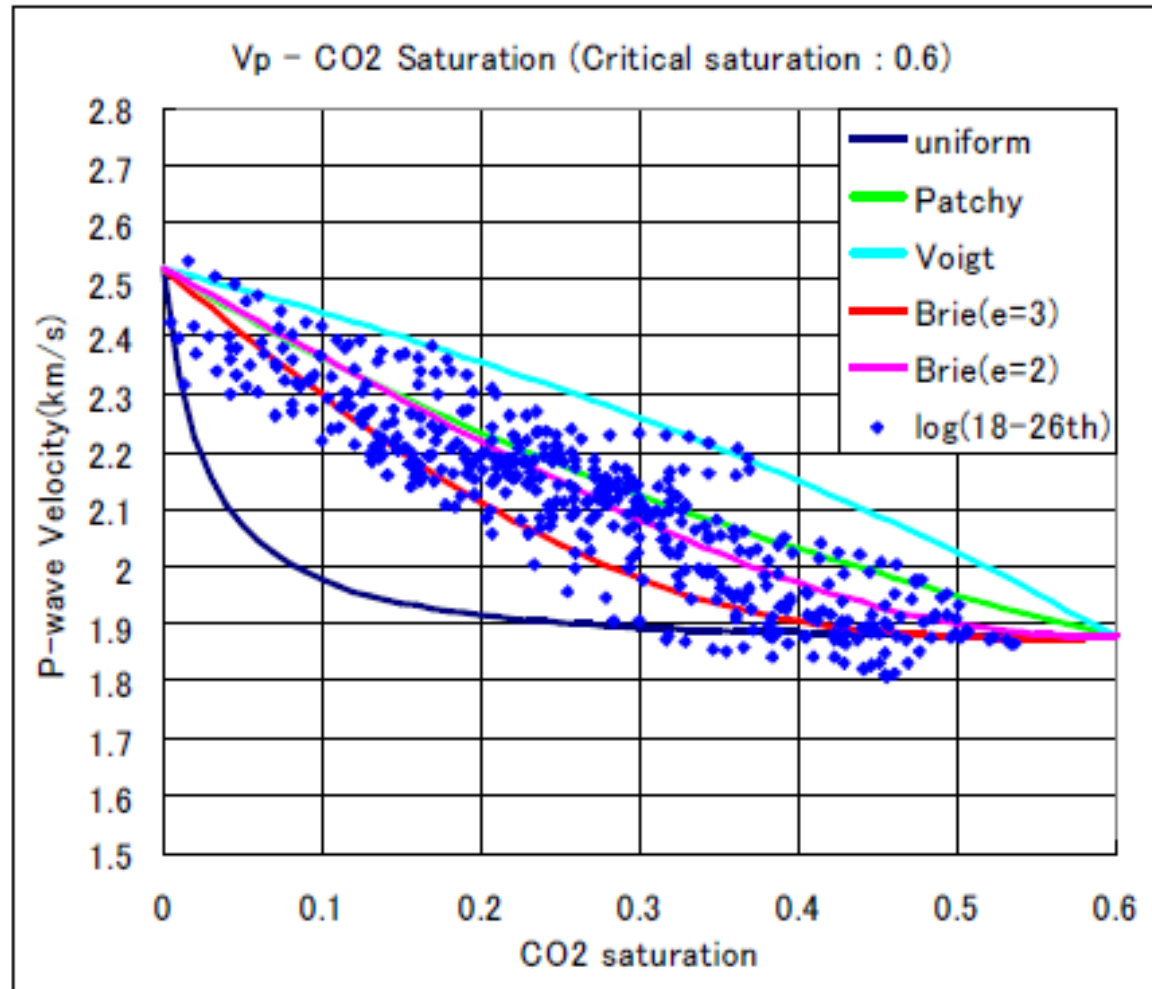
Effective rock modulus

M_i is the i^{th} rock modulus
saturated with 100% fluid "i".

Substitute M_{patchy} directly into V_p equation.

(i.e., no Gassmann involved).

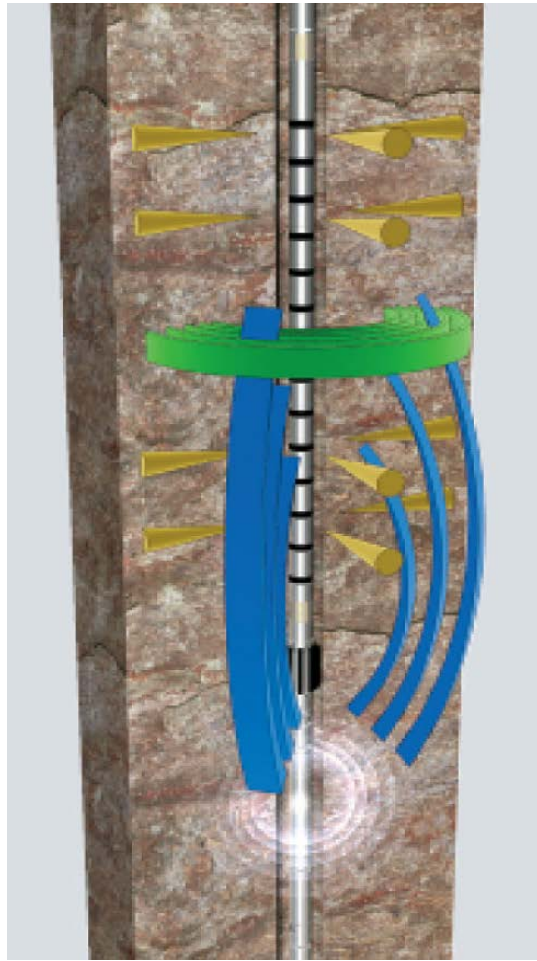
velocity-saturation curves



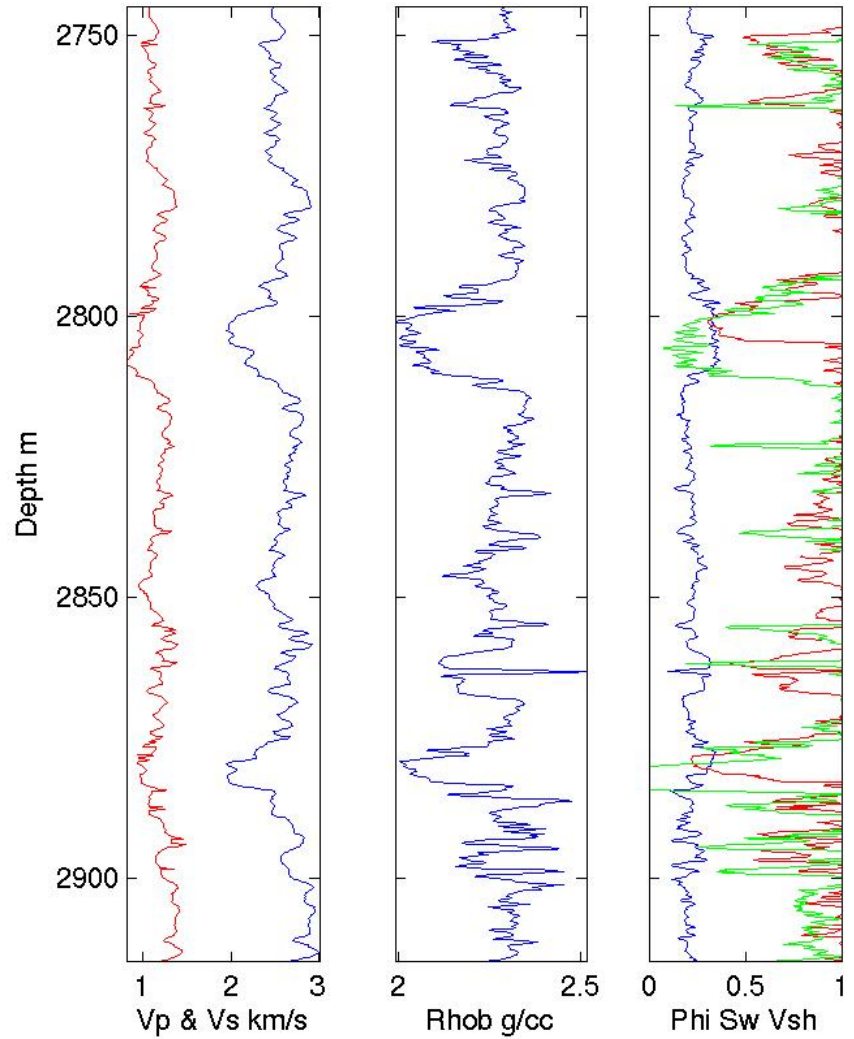
Konishi, OYO

Rock Physics properties from well logs

Seismic logging tools



Schlumberger



Lumley et al.

Velocity Equations

well logs

$$V_p = \sqrt{\frac{K + \frac{4}{3}G}{\rho}}$$

P-wave velocity

$$V_s = \sqrt{\frac{G}{\rho}}$$

S-wave velocity

Velocity Equations

calculate

$$V_p = \sqrt{\frac{K + \frac{4}{3}G}{\rho}}$$

P-wave velocity

$$V_s = \sqrt{\frac{G}{\rho}}$$

S-wave velocity

Velocity Equations

inverse
Gassmann

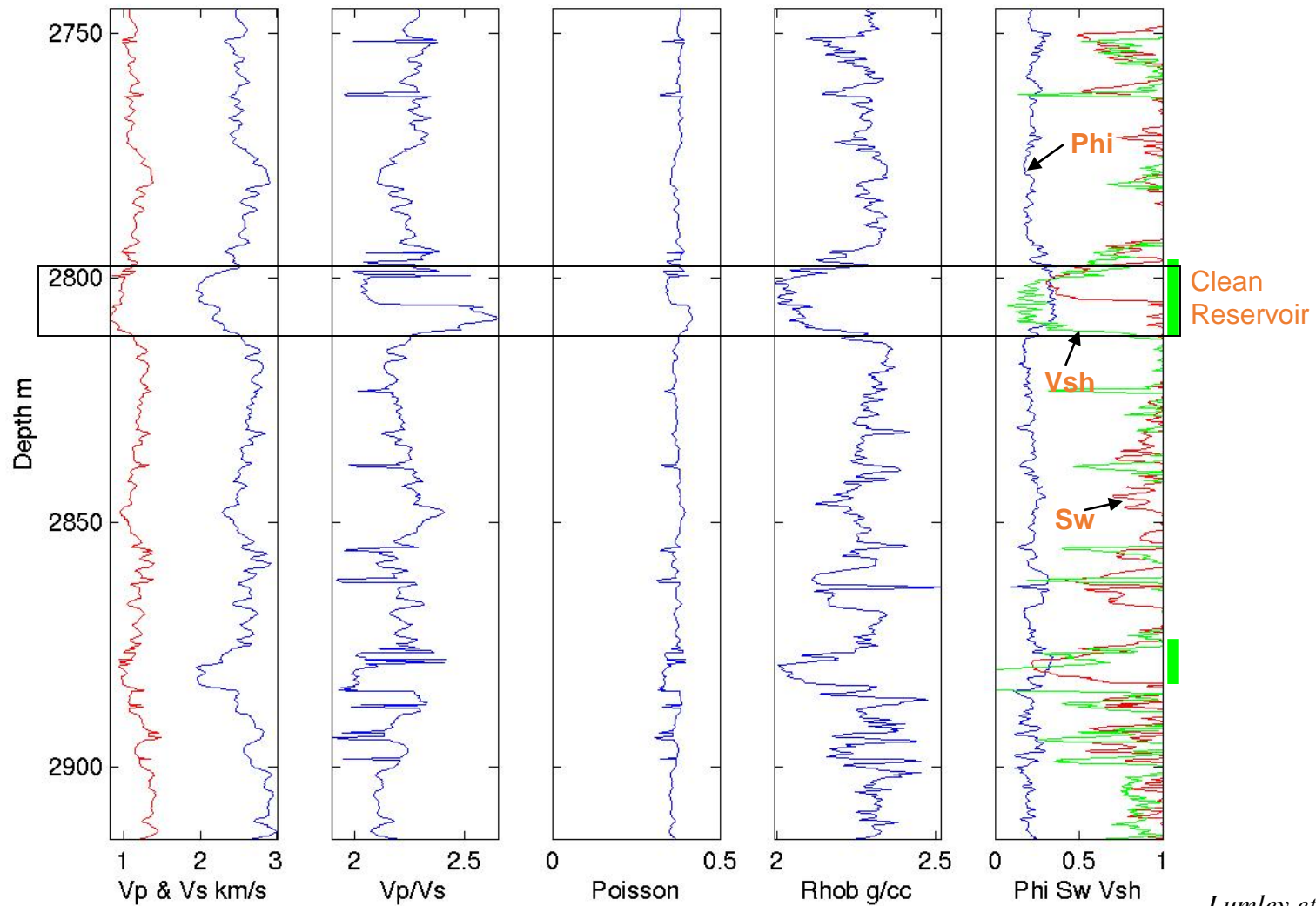
$$V_{p_{dry}} = \sqrt{\frac{K_d + \frac{4}{3}G}{\rho_d}}$$

P-wave velocity

$$V_{s_{dry}} = \sqrt{\frac{G}{\rho_d}}$$

S-wave velocity

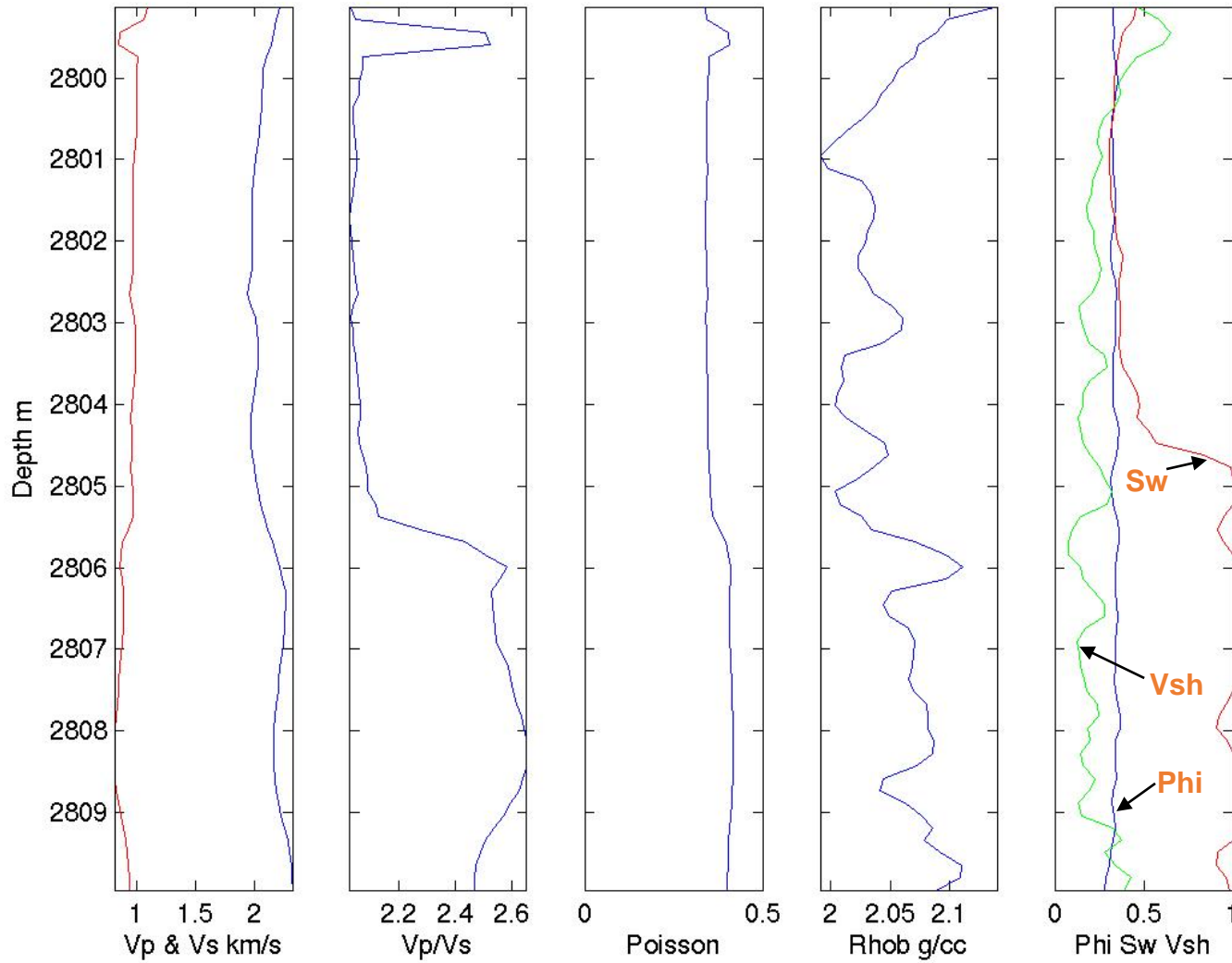
Well #1 logs... Full Reservoir Interval



Lumley et al.

Well #1 Zoom on Upper Reservoir Interval

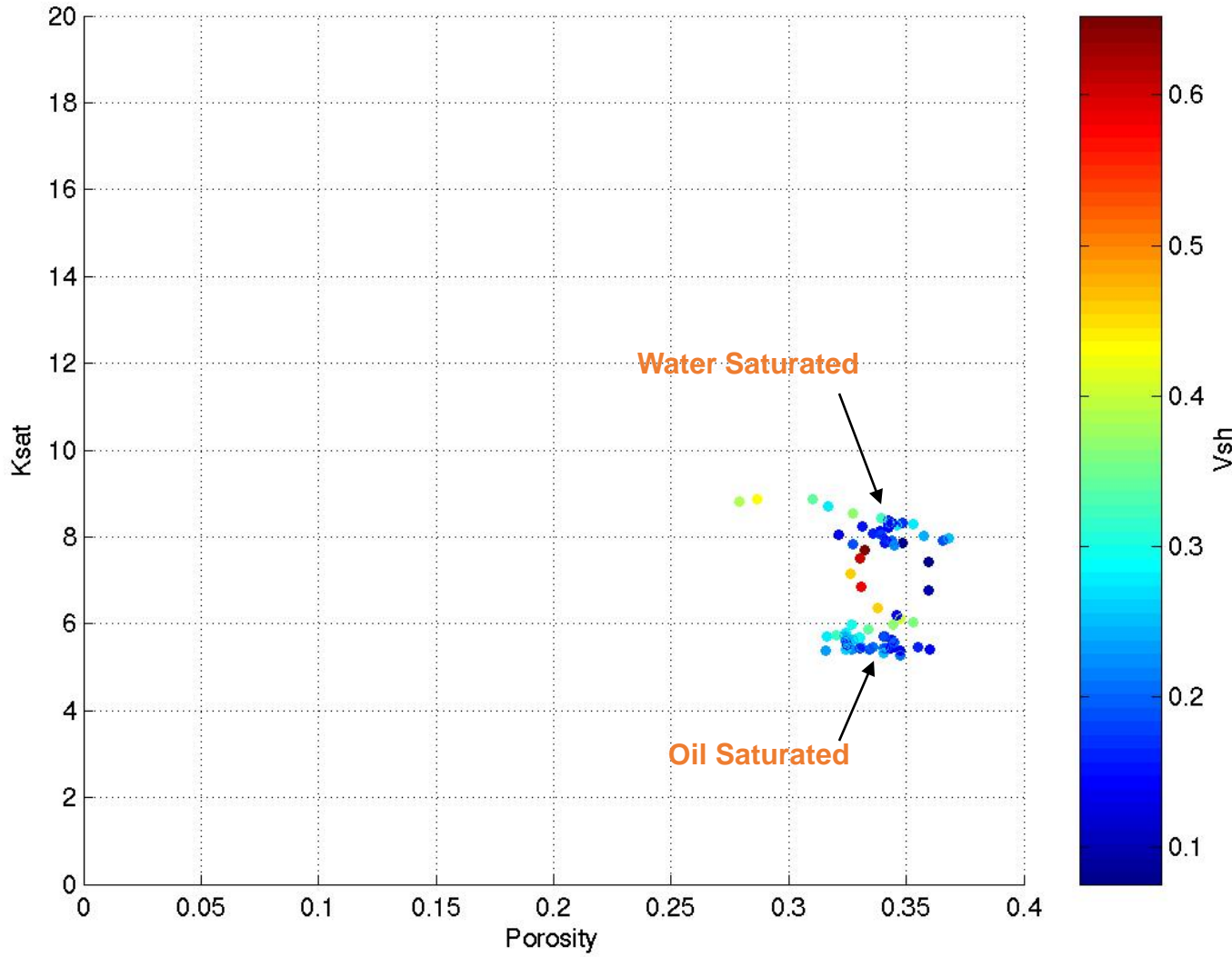
Upper Zone 2799 – 2810 m



Lumley et al.

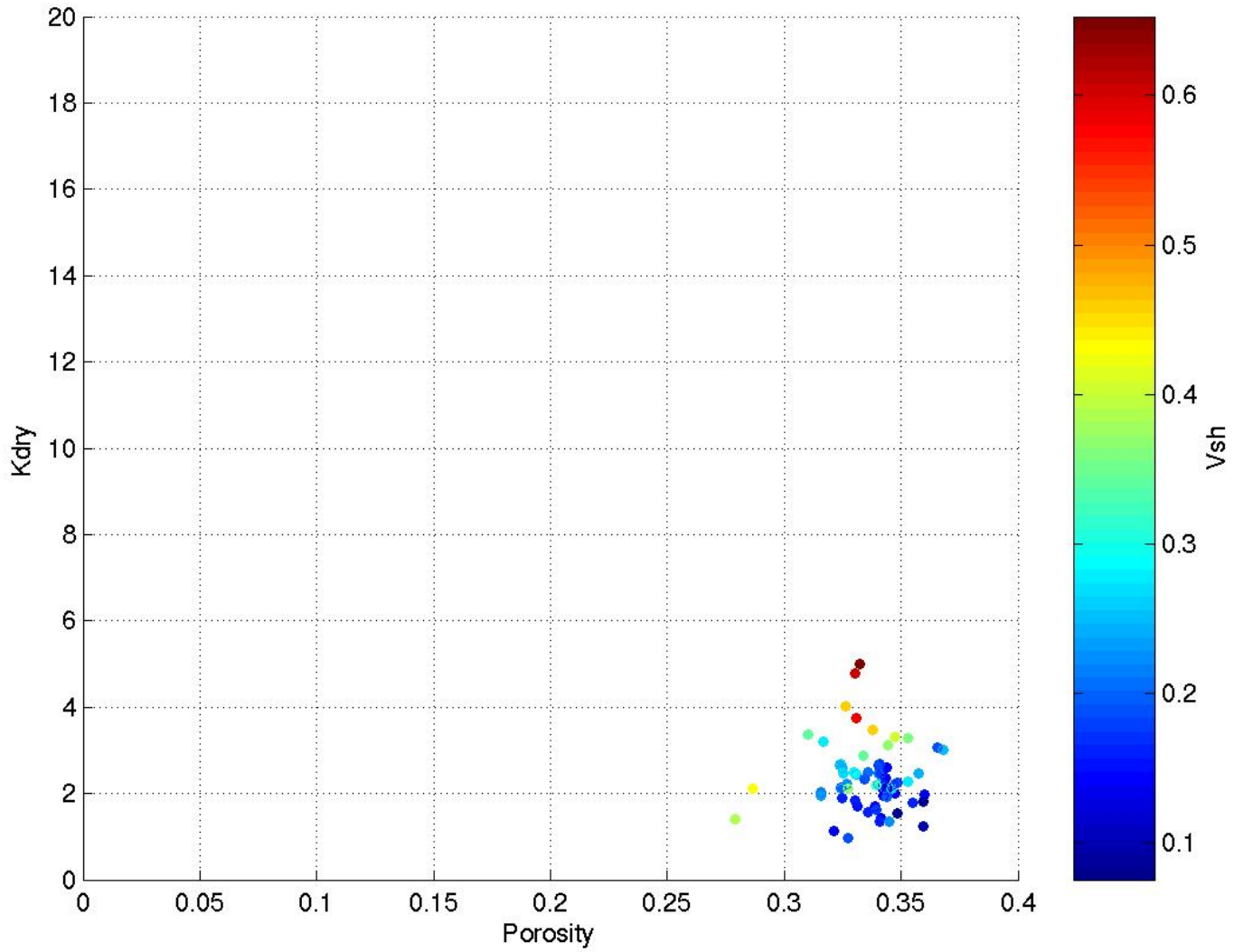
Well #1 Ksat... Upper Reservoir Interval

Upper Zone 2799 – 2810 m



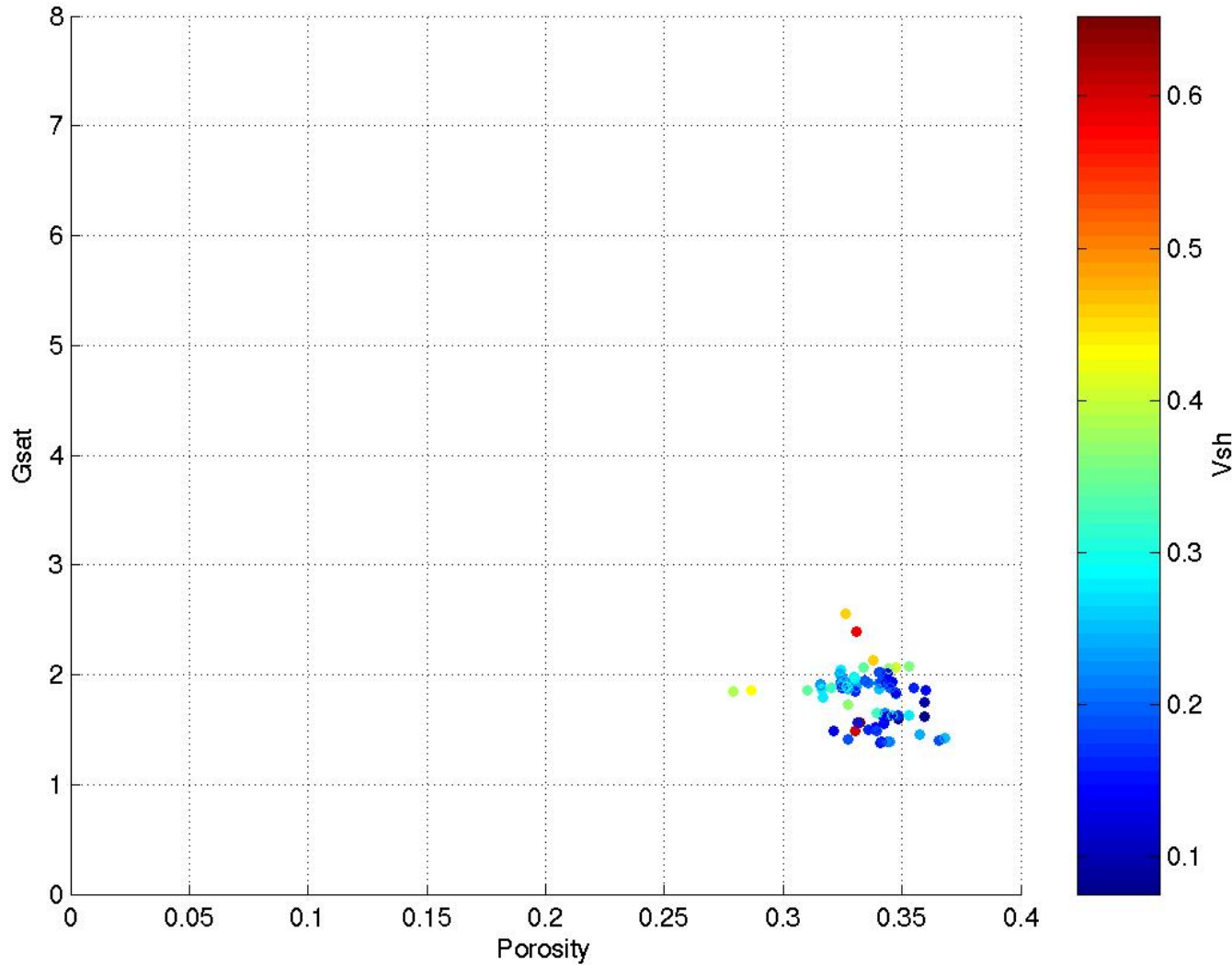
Lumley et al.

Well #1 Kdry... Upper Reservoir Interval Upper Zone 2799 – 2810 m



Lumley et al.

Well #1 Gsat... Upper Reservoir Interval Upper Zone 2799 – 2810 m

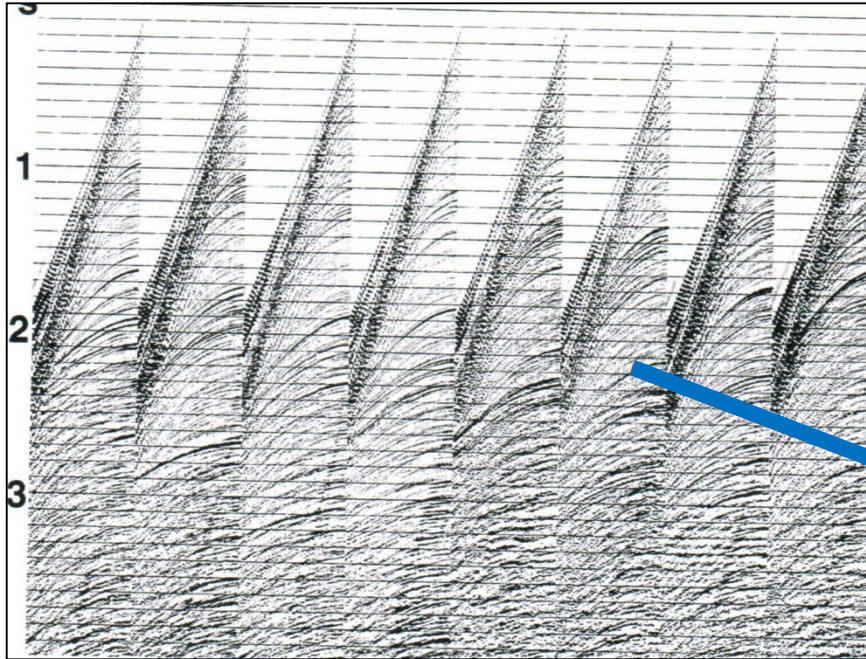


Lumley et al.

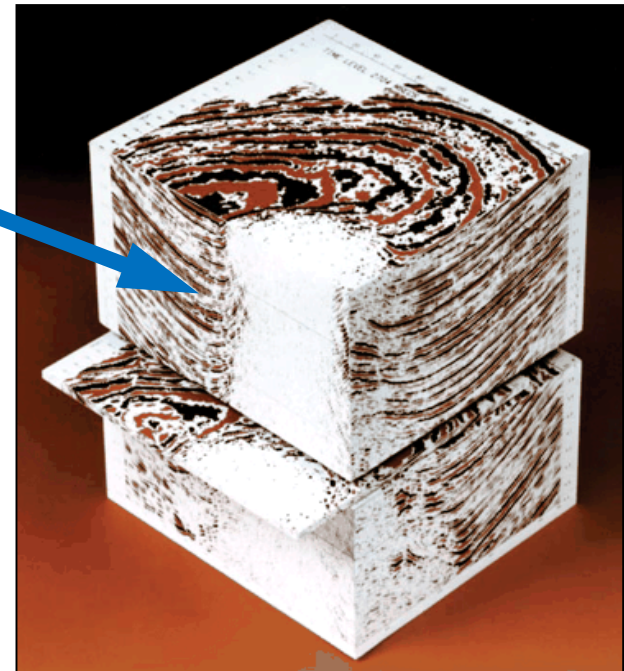
3D + 4D Seismic Imaging

3D seismic imaging

so how do we go from this...



to this... ?



Scalar wave equation modeling

$$d = \mathcal{F}m$$

$$(v^2 \nabla^2 - \partial_{tt}) P(\underline{x}, t) = 0$$

$$\begin{aligned}
 m &= v(\underline{x}) \\
 \mathcal{F} &= \nabla^2 - \partial_{tt} \\
 d &= P(\underline{x}, t)
 \end{aligned}$$

Full waveform inversion

$$\mathbf{m} = \mathbf{F}^{-1}\mathbf{d}$$

$$\min \mathbf{e}^2 = w_d^2 (\mathbf{d} - \mathbf{F}\mathbf{m})^2 + w_m^2 (\mathbf{m} - \mathbf{m}_0)^2 + \dots$$

subject to constraints: $\nabla \mathbf{m} \approx \mathbf{0}$ etc...

\mathbf{F} *WEQ modeling operator*

\mathbf{m} *2D/3D velocity model*

WEQ imaging + velocity analysis

$$\mathbf{R} \sim \nabla \mathbf{m} \sim (\mathbf{F}^* \mathbf{F})^{-1} \mathbf{F}^* \mathbf{d} \sim \mathbf{F} \mathbf{s} \times \mathbf{F}^* \mathbf{m} \mathbf{d} |_{ic}$$

min $\mathbf{e}^2 = \mathbf{Image\ Quality} \dots$

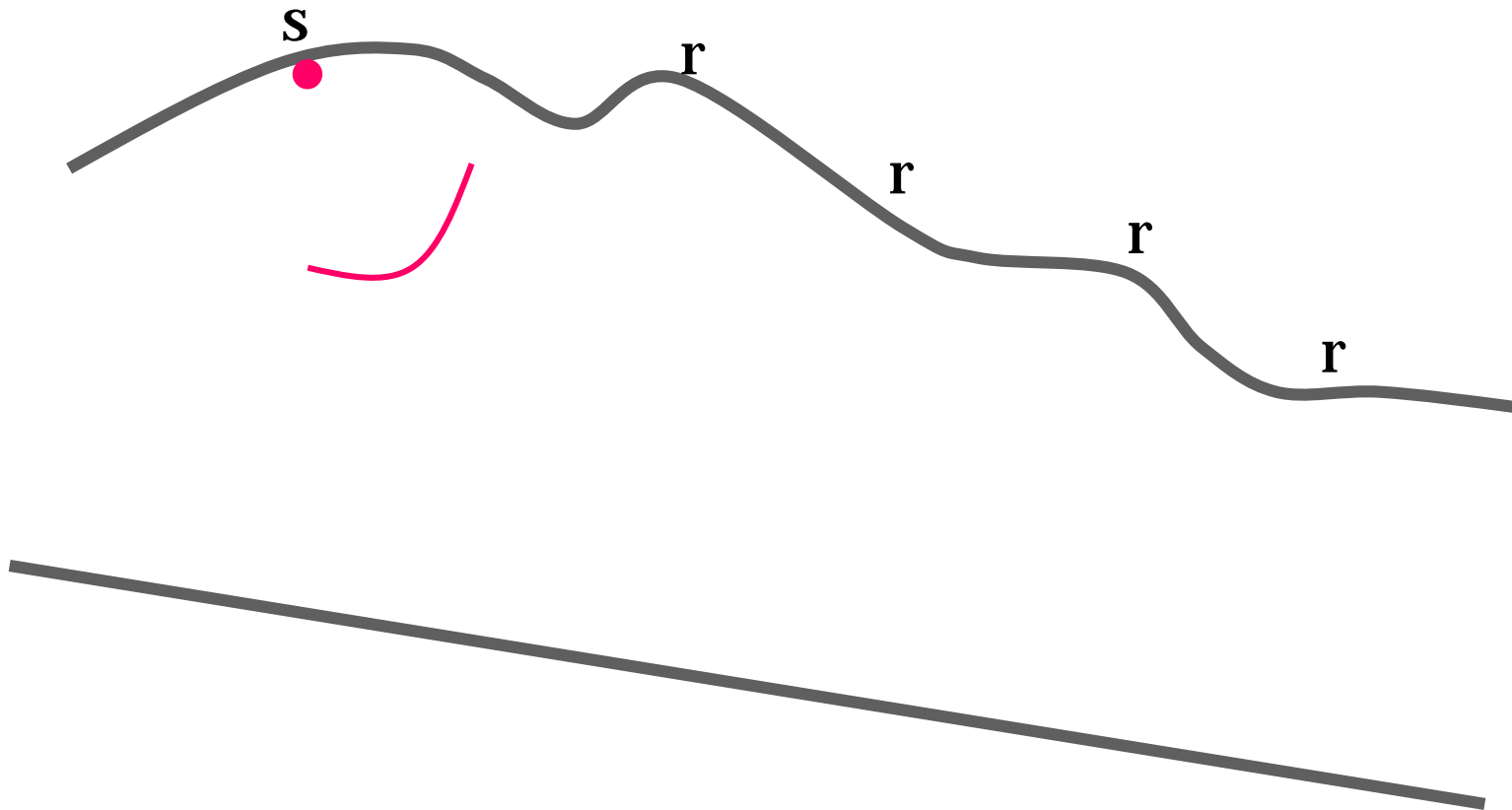
subject to constraints: $\nabla_x \mathbf{R} \approx \mathbf{0}$ etc...

\mathbf{F}^* WEQ imaging (adjoint) operator

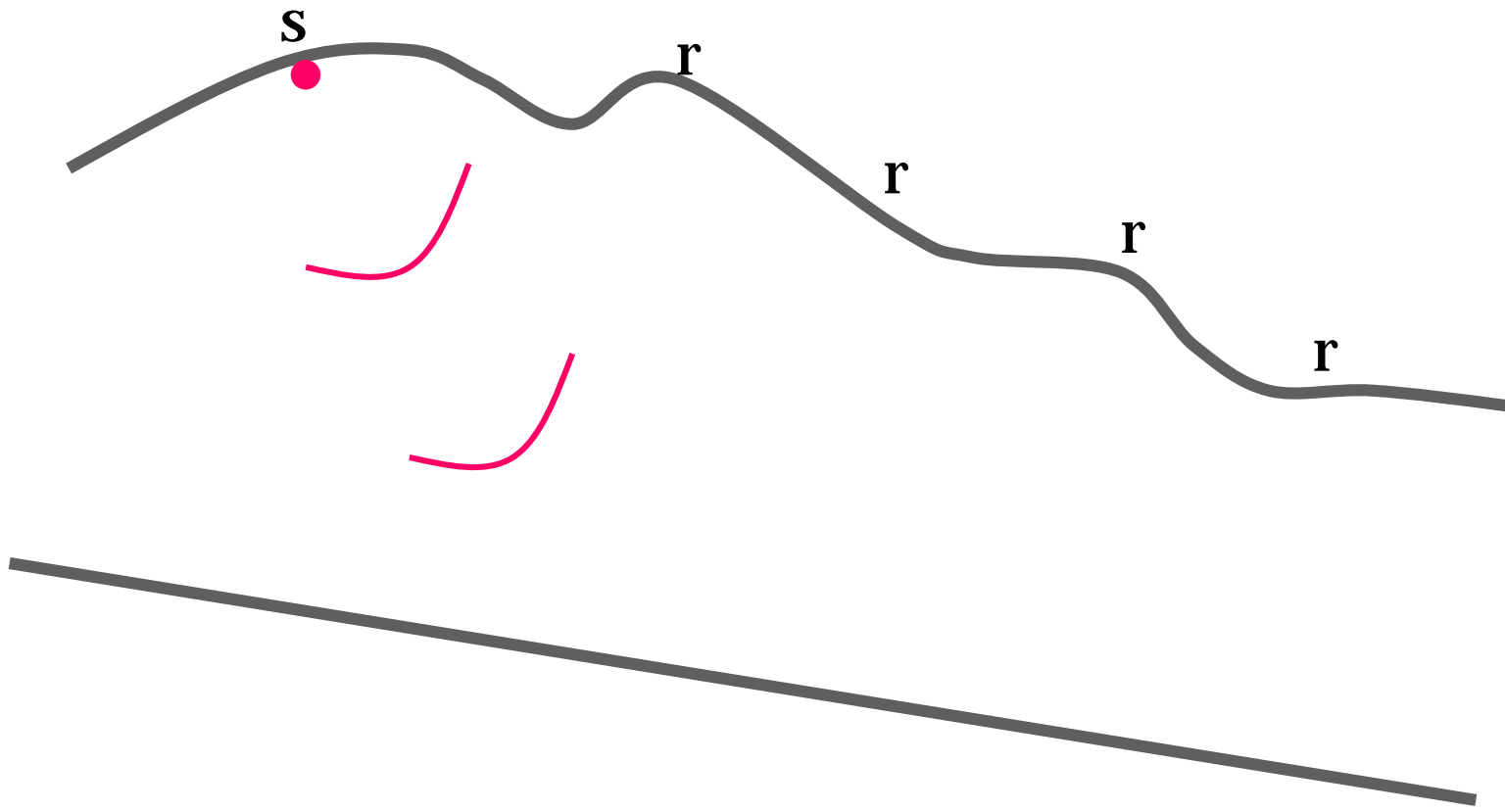
\mathbf{m} 2D/3D velocity model

\mathbf{R} migrated reflectivity image

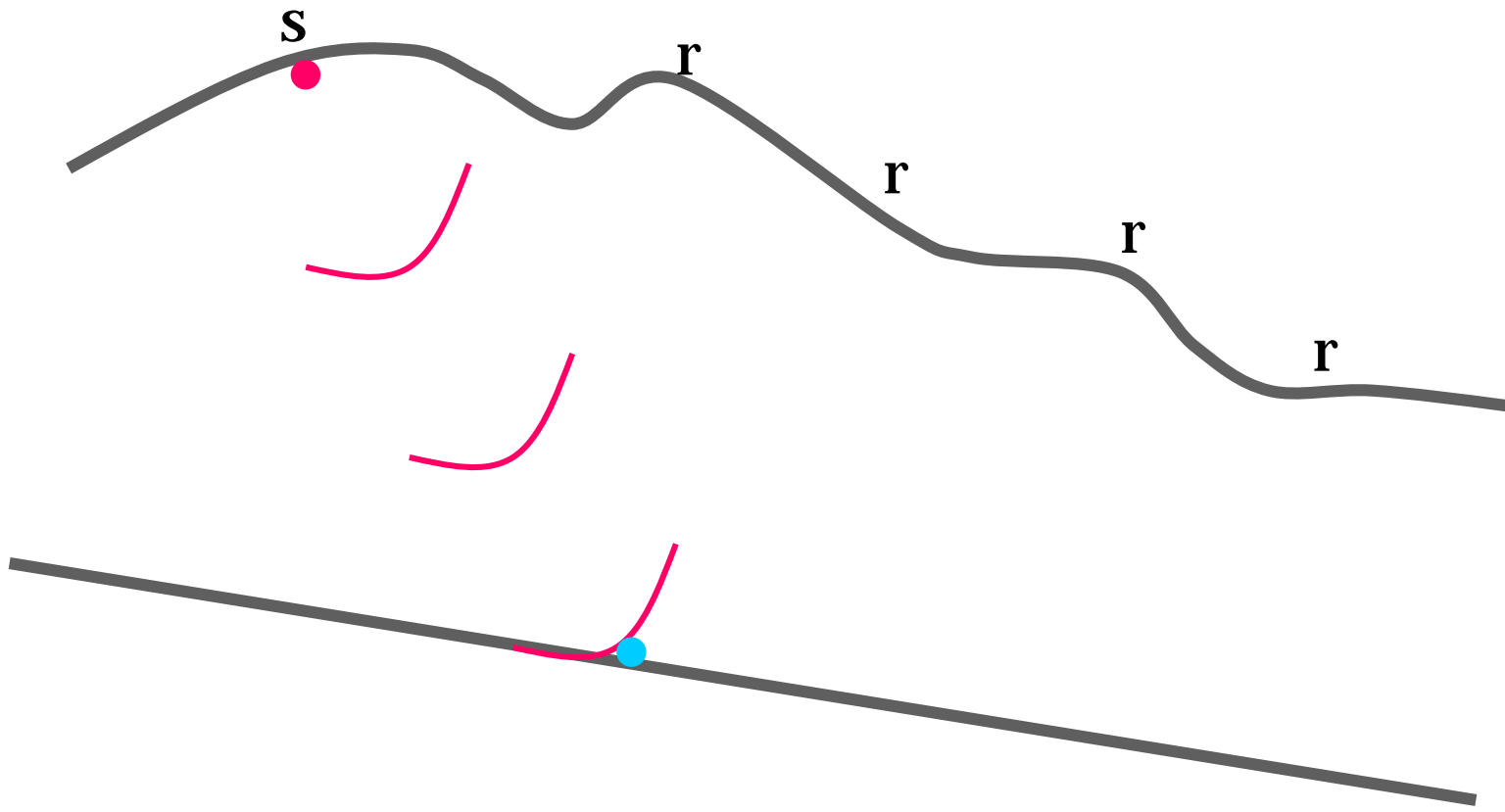
prestack modeling



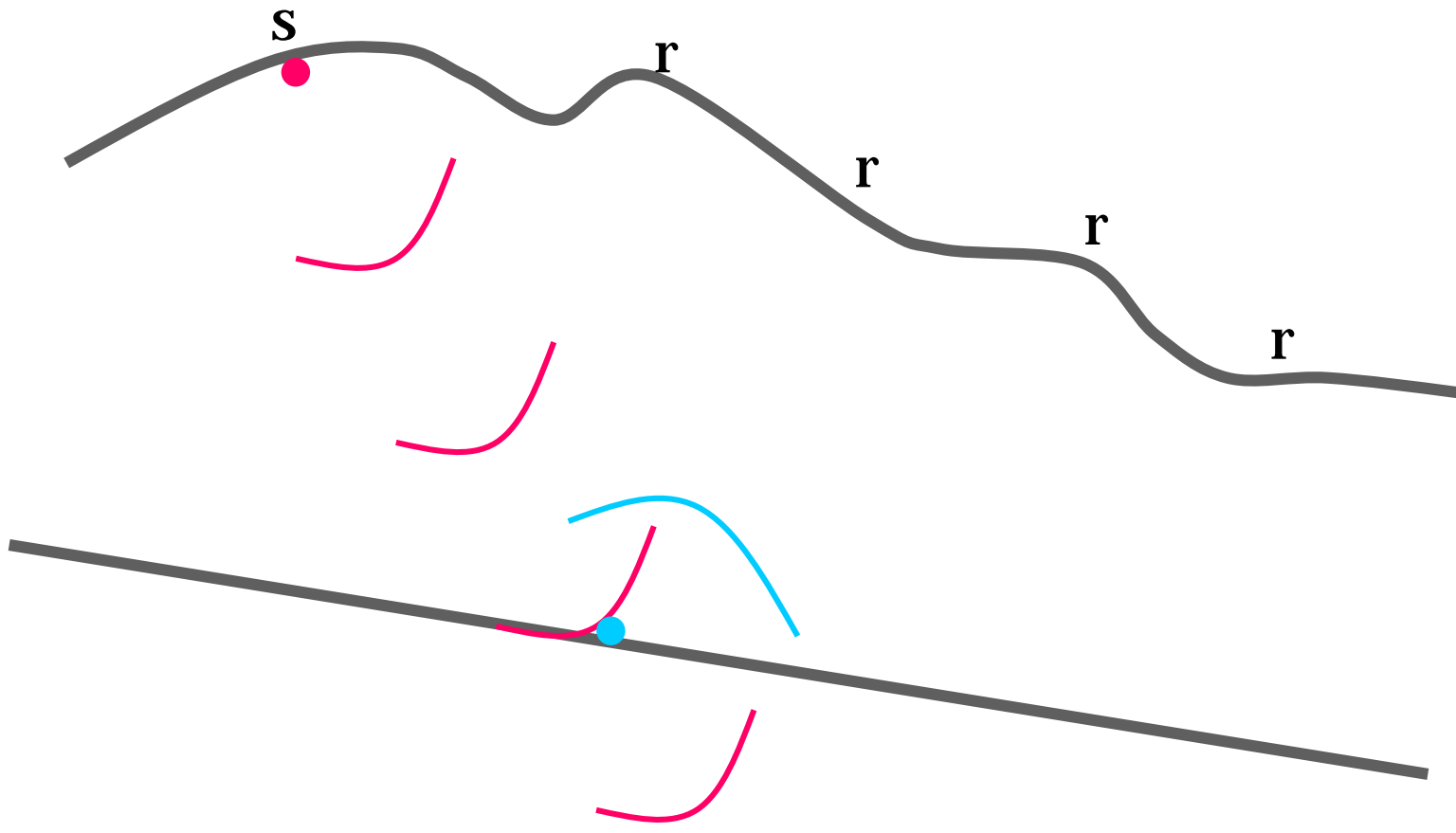
prestack modeling



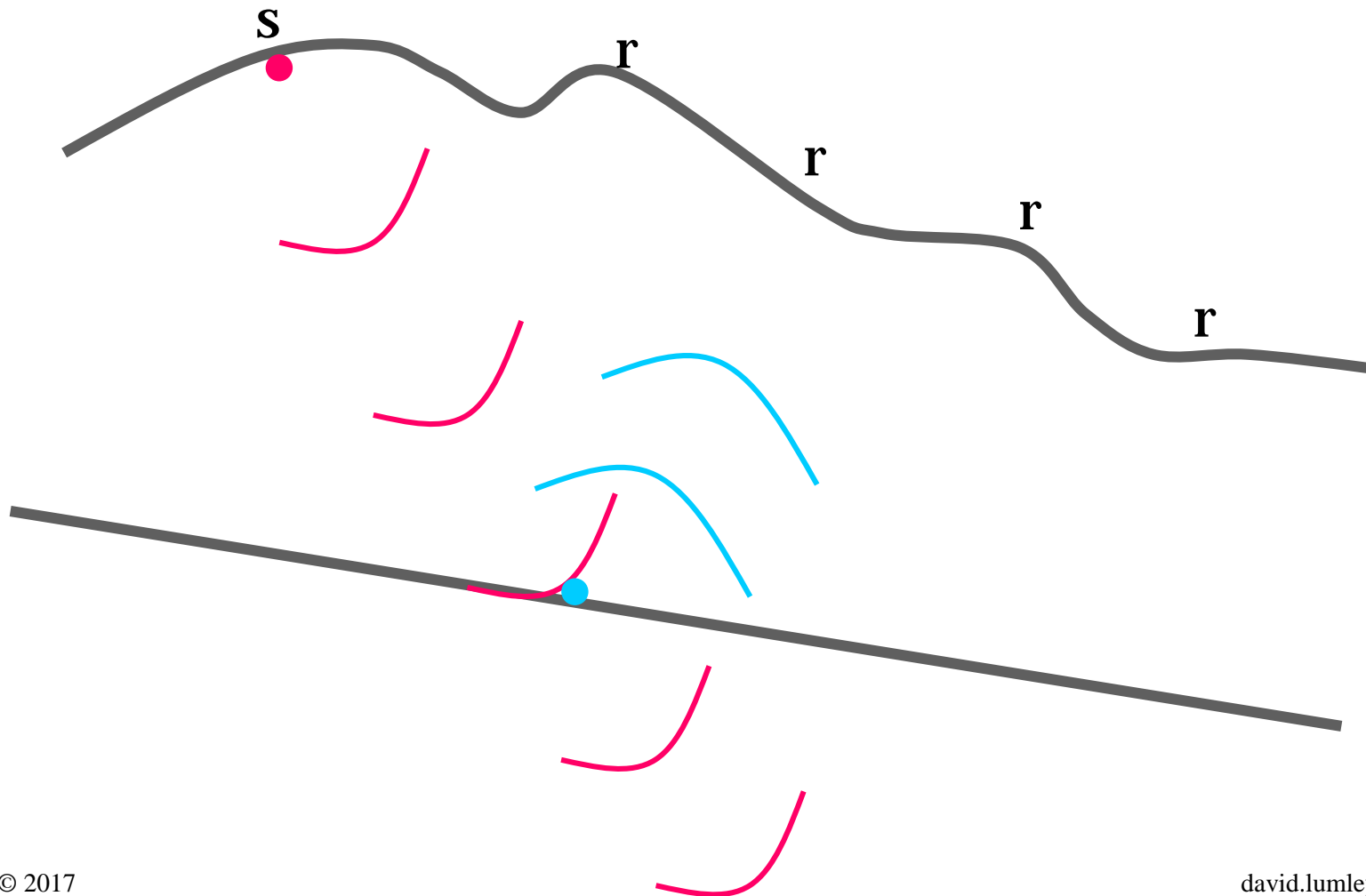
prestack modeling



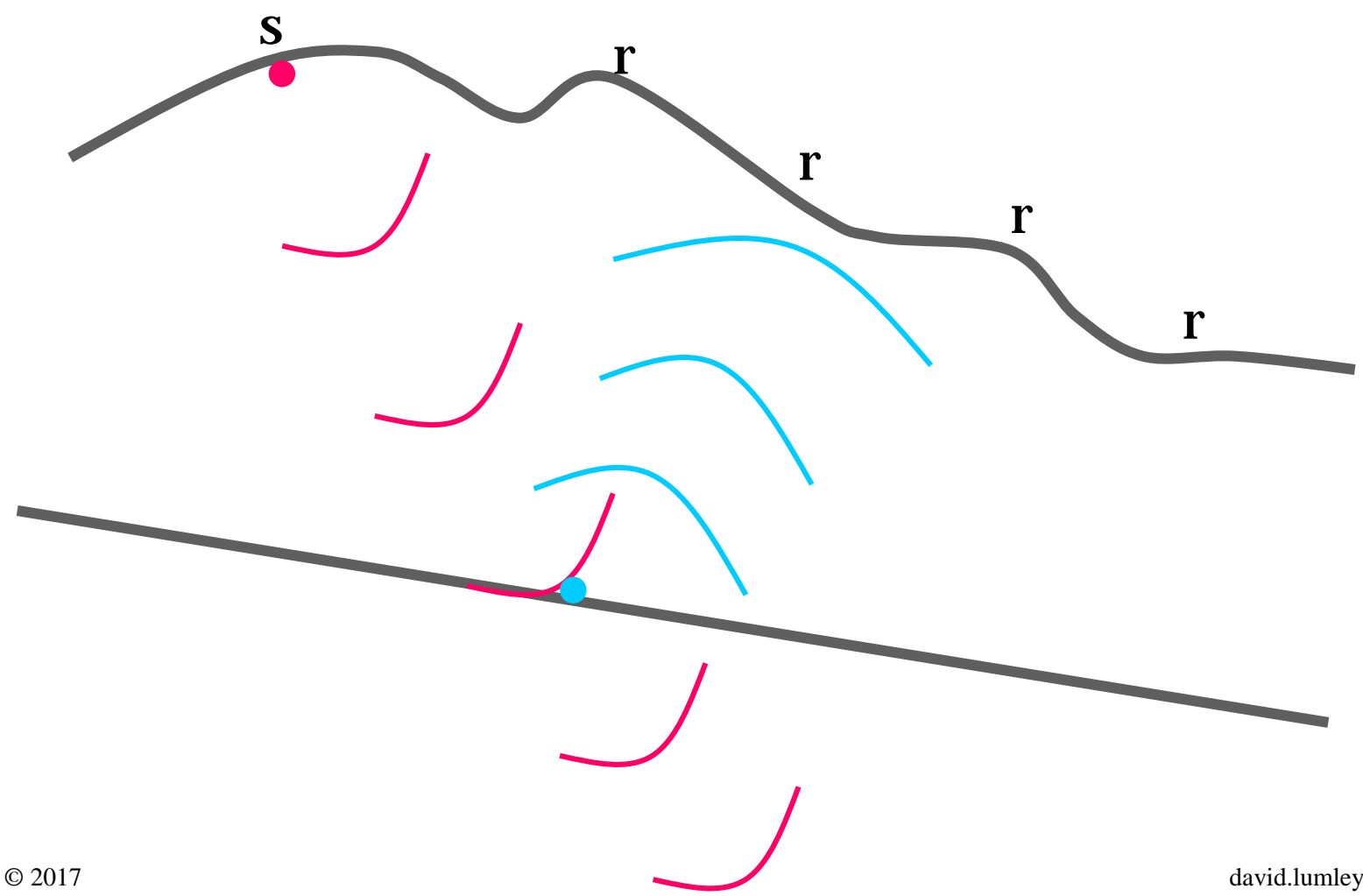
prestack modeling



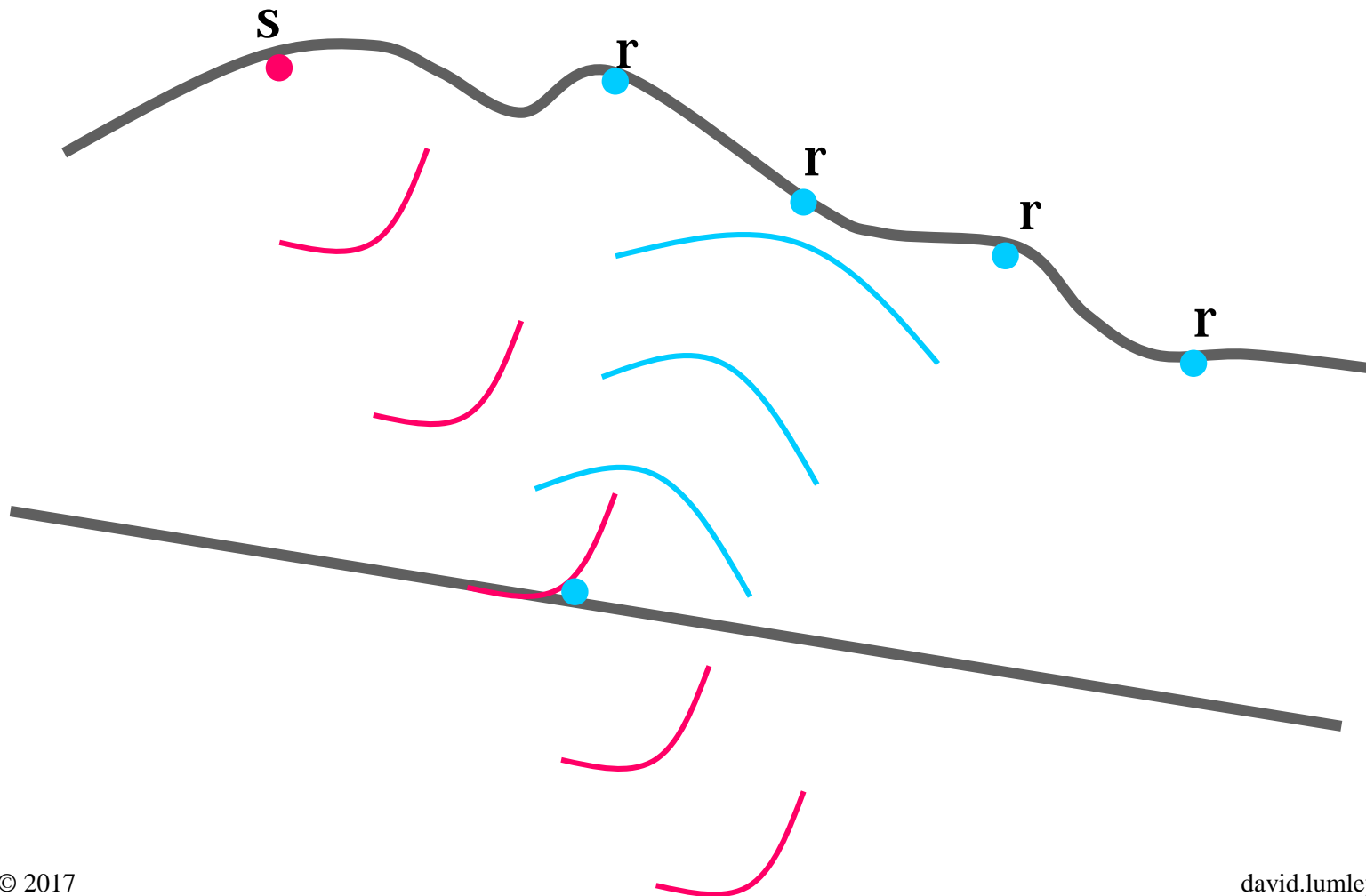
prestack modeling



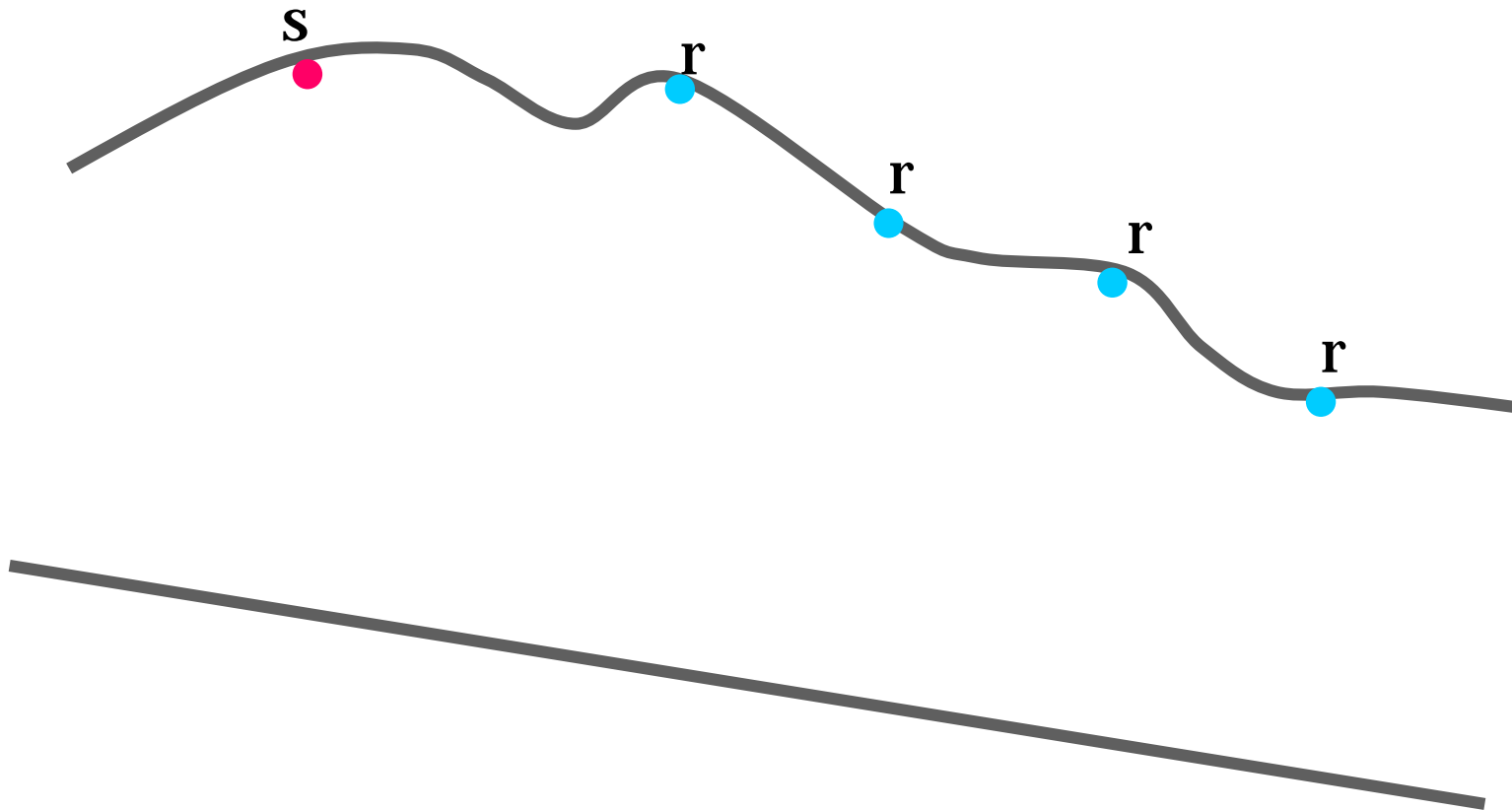
prestack modeling



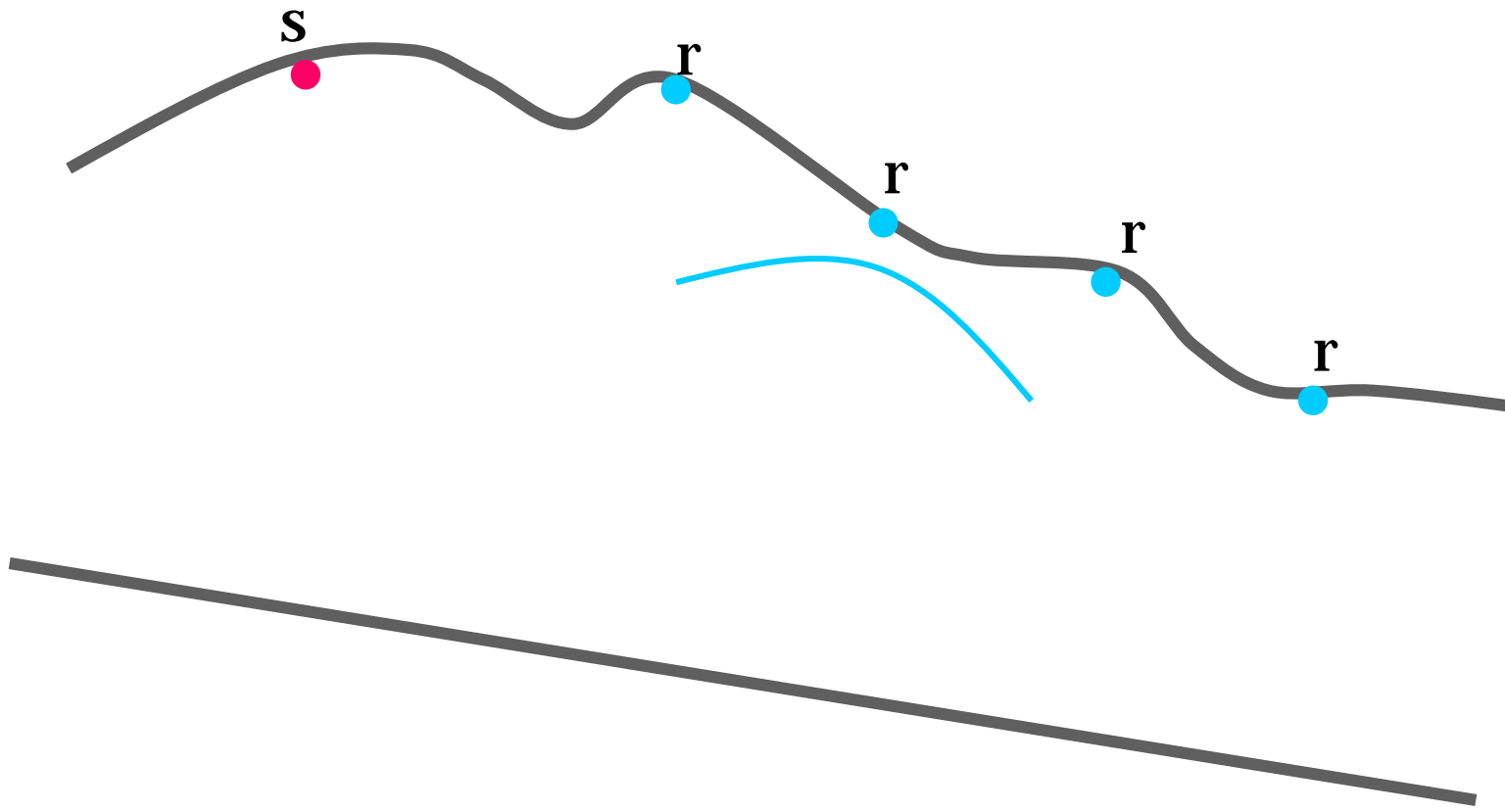
prestack modeling



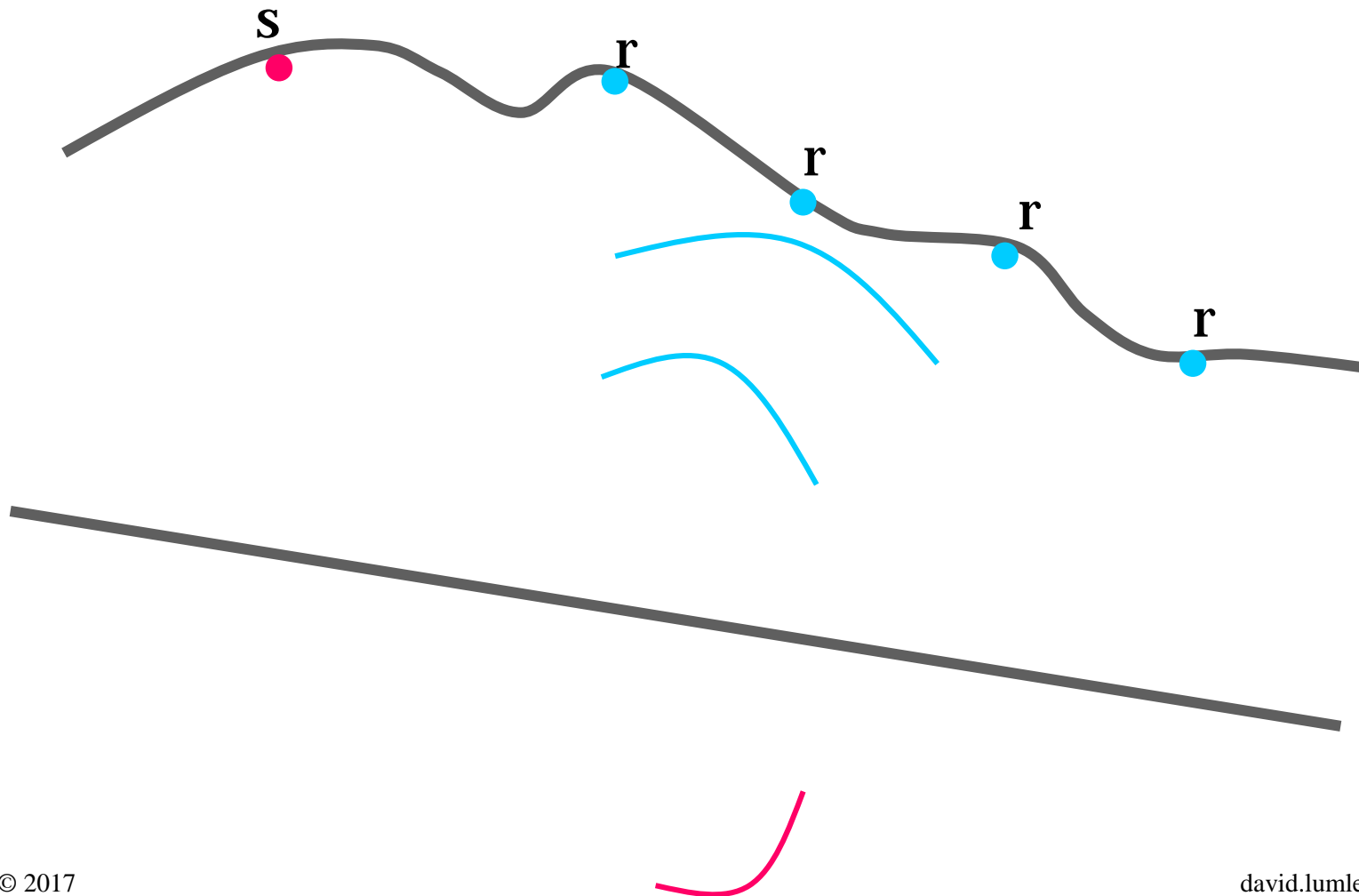
prestack imaging*



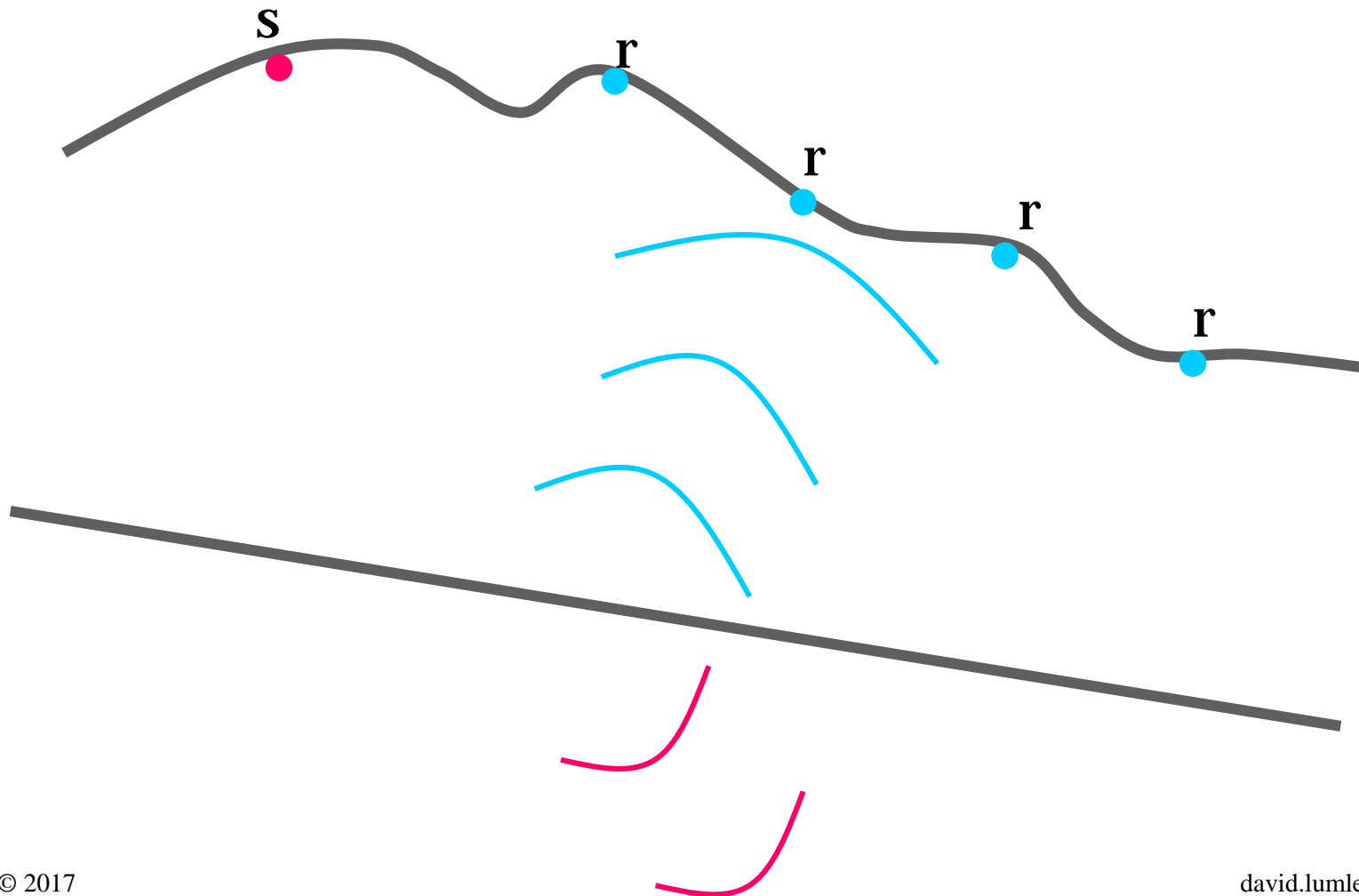
prestack imaging



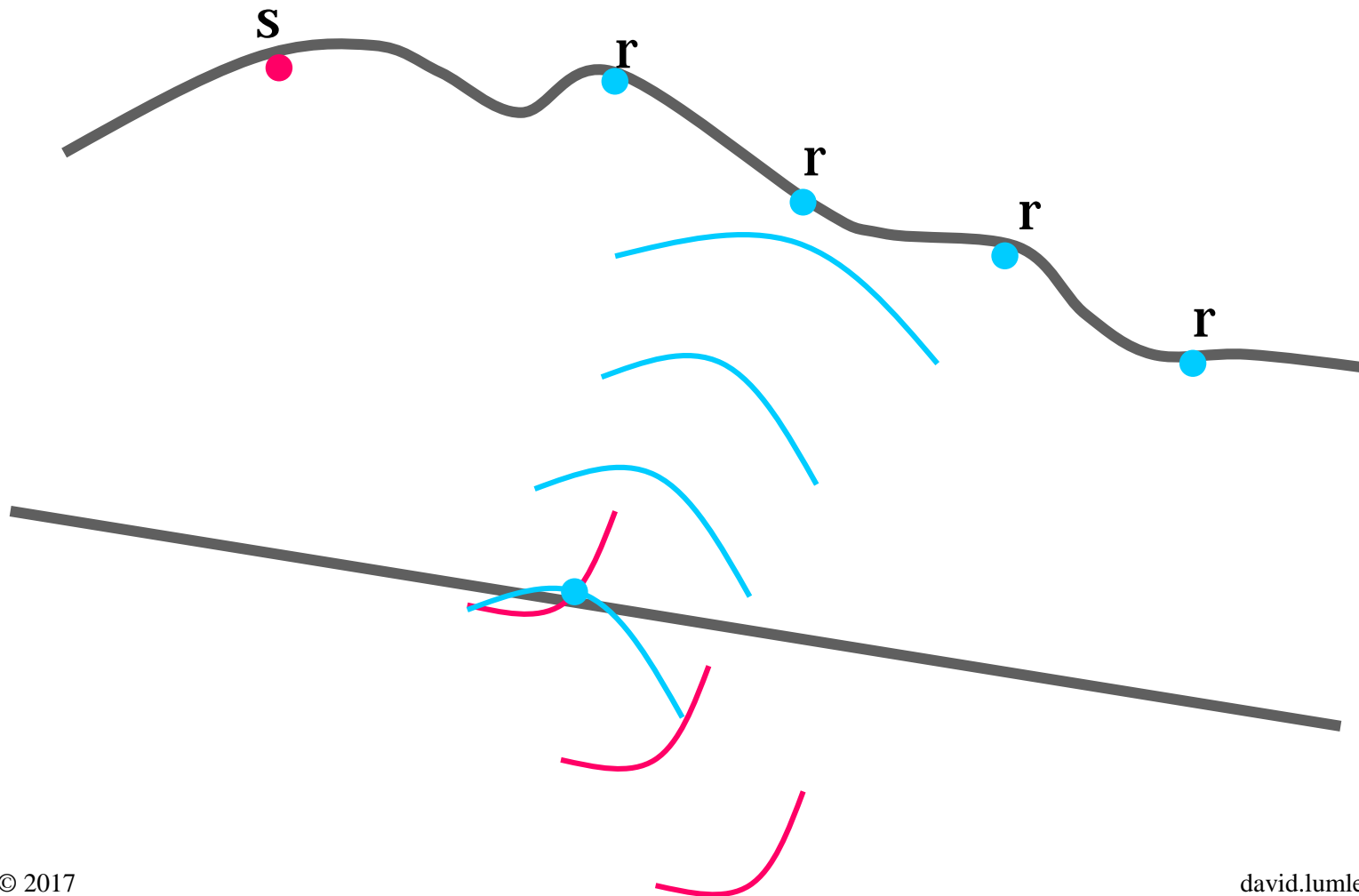
prestack imaging



prestack imaging



prestack imaging



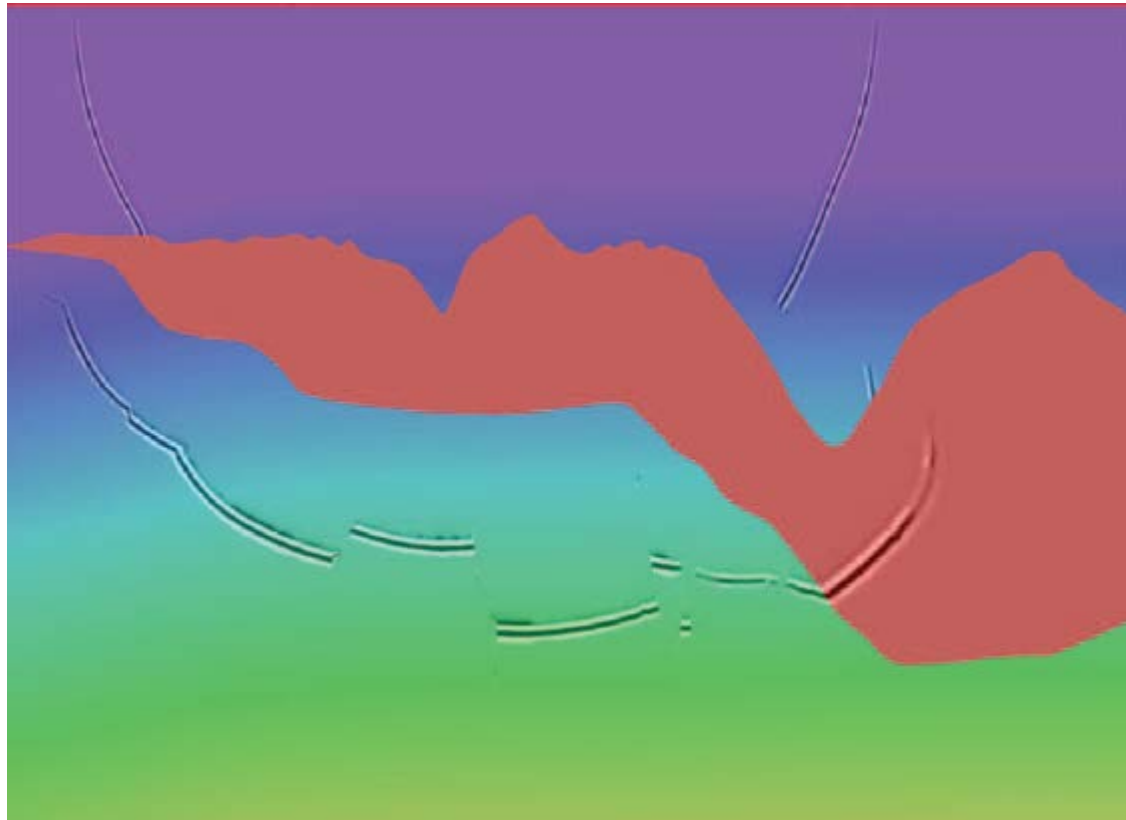
Imaging methods

- Different ways to solve the wave equation:

$$\{ \nabla^2 - \partial_{tt}/v^2 \} \mathcal{P}(\mathbf{x},t) = 0$$

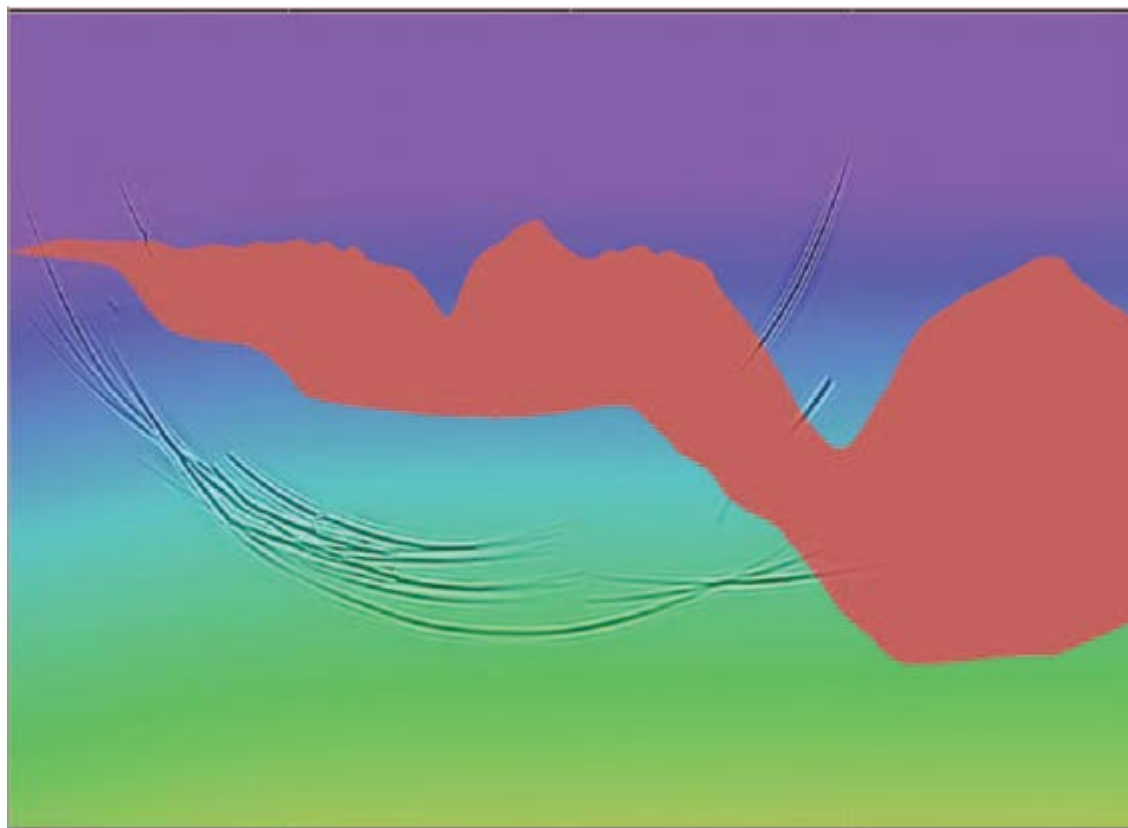
- Kirchhoff/rays/beams: *by Integral (summation) methods*
- Frequency-domain: *by Fourier/Laplace transforms*
- Finite Difference: *by FD/FEM operators*
- Hybrid methods: *any combinations of the above*

Kirchhoff



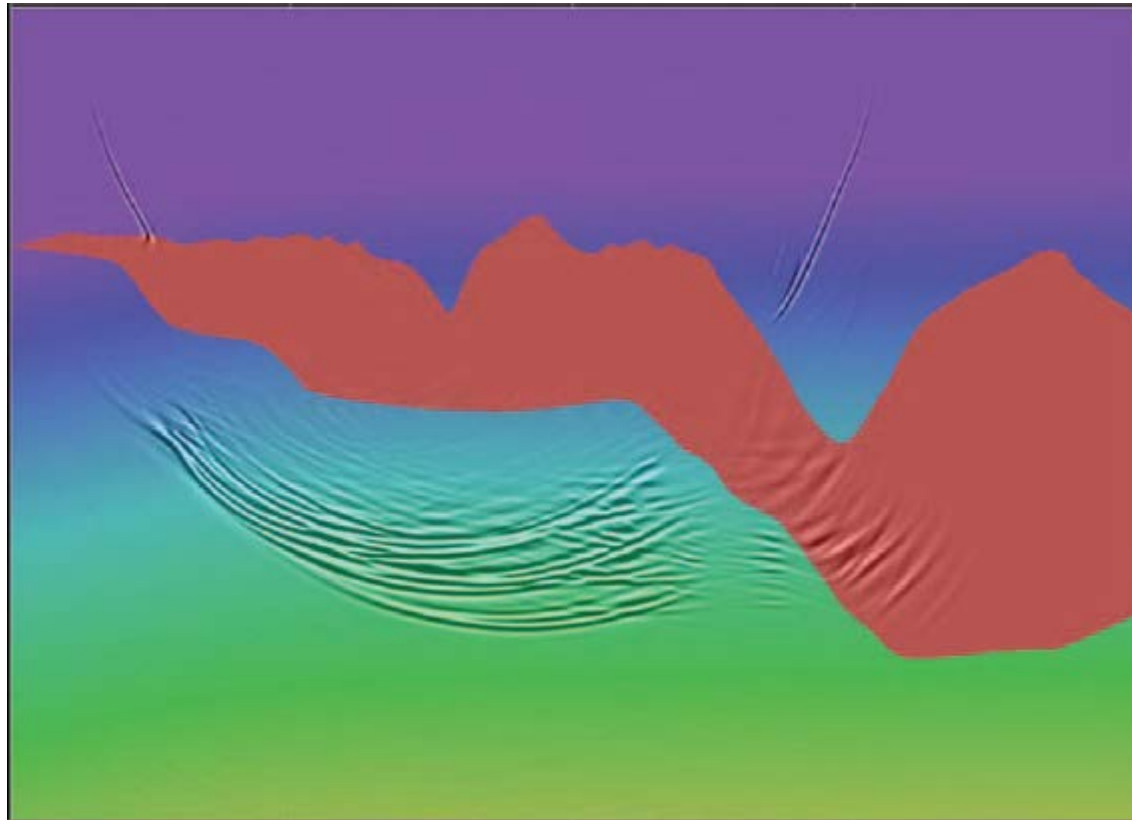
Etgen et al. (2009)

Gaussian Beam



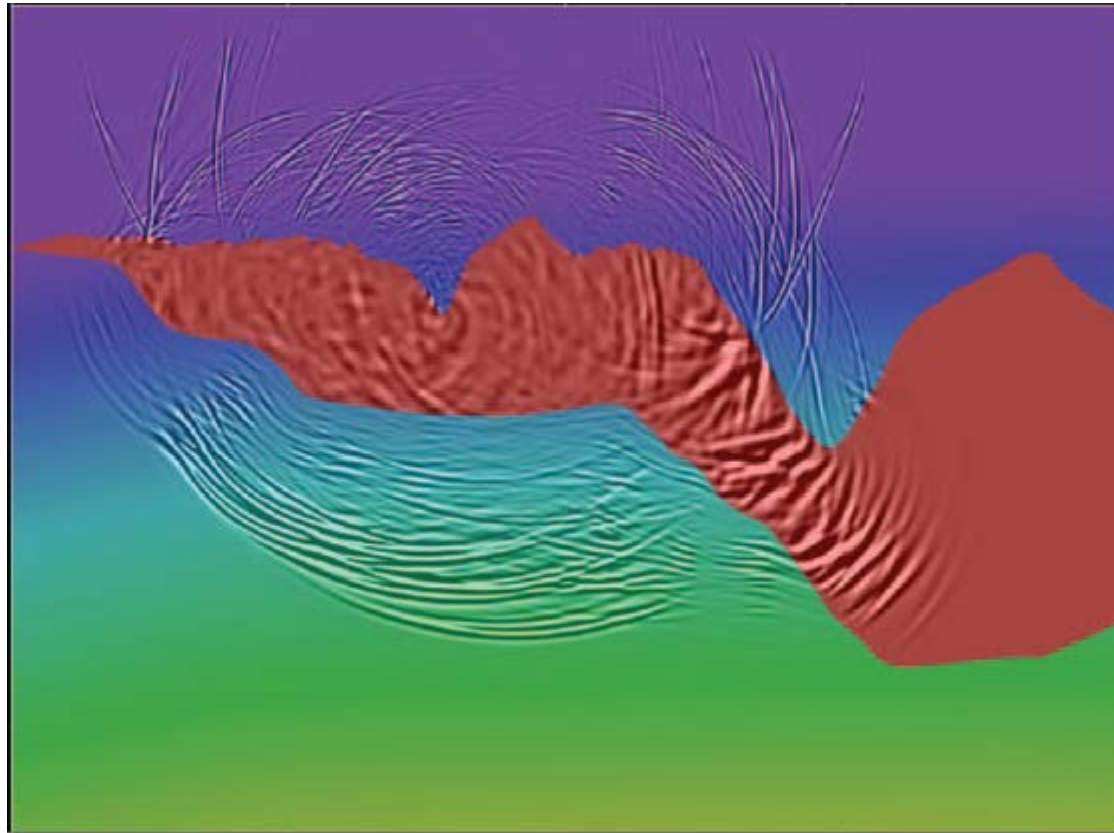
Etgen et al. (2009)

WEM (1-way)



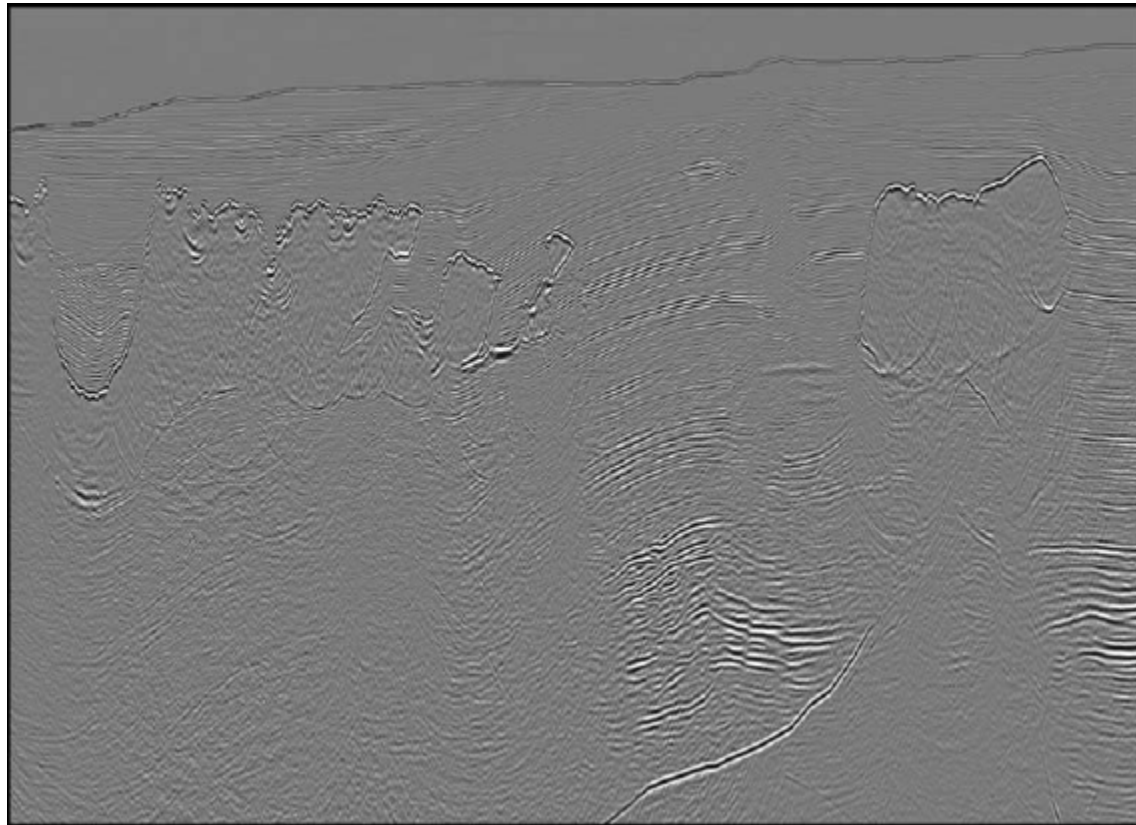
Etgen et al. (2009)

Reverse-time (RTM)



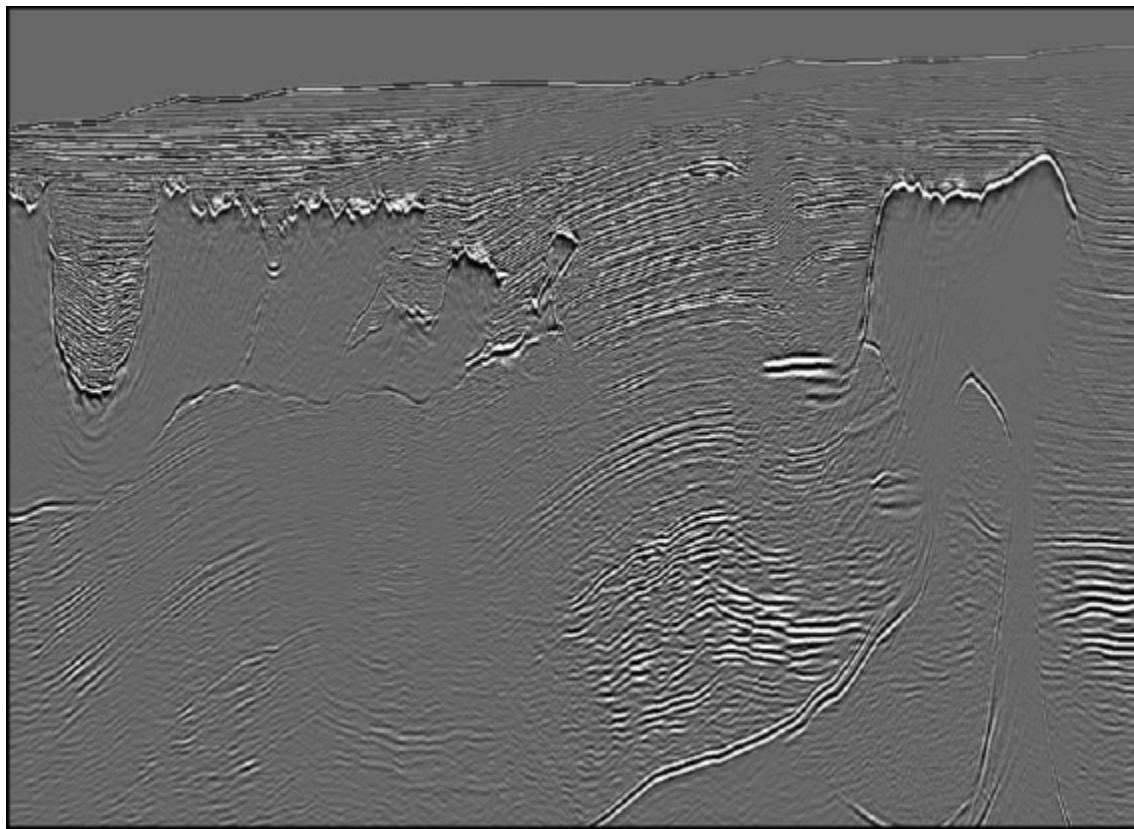
Etgen et al. (2009)

Kirchhoff



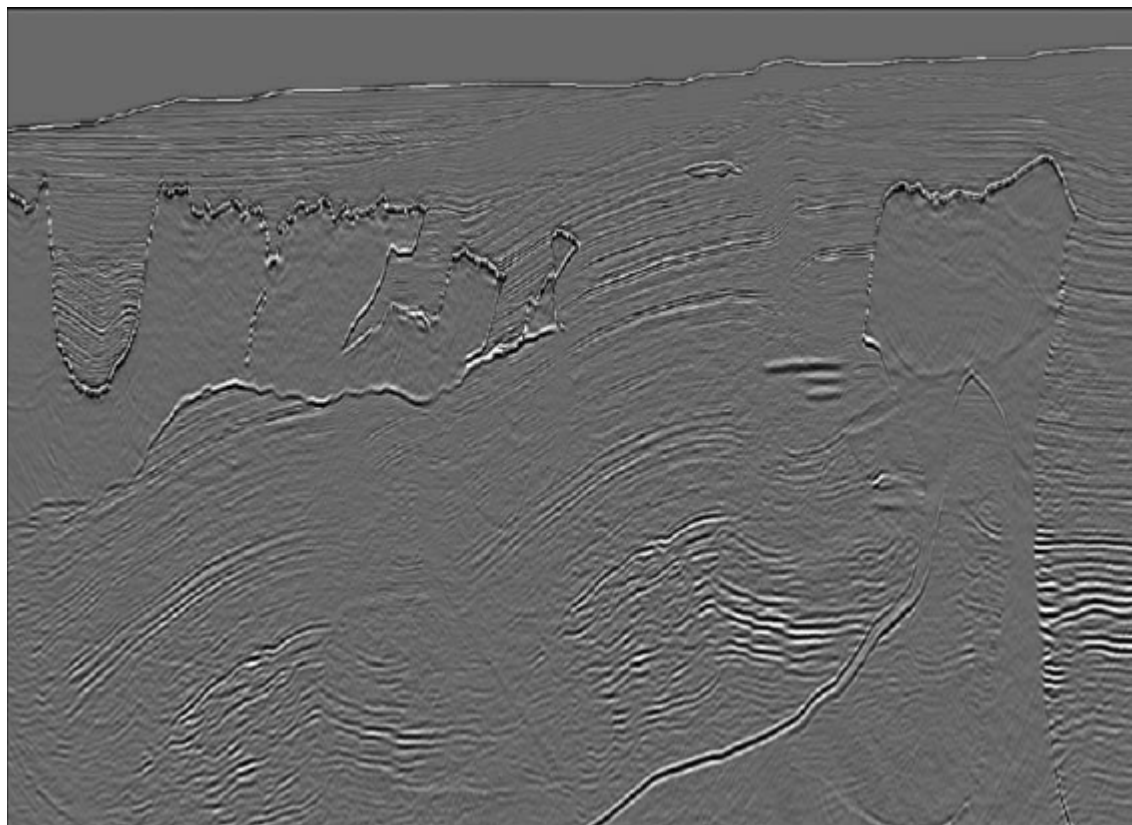
Etgen et al. (2009)

Gaussian Beam



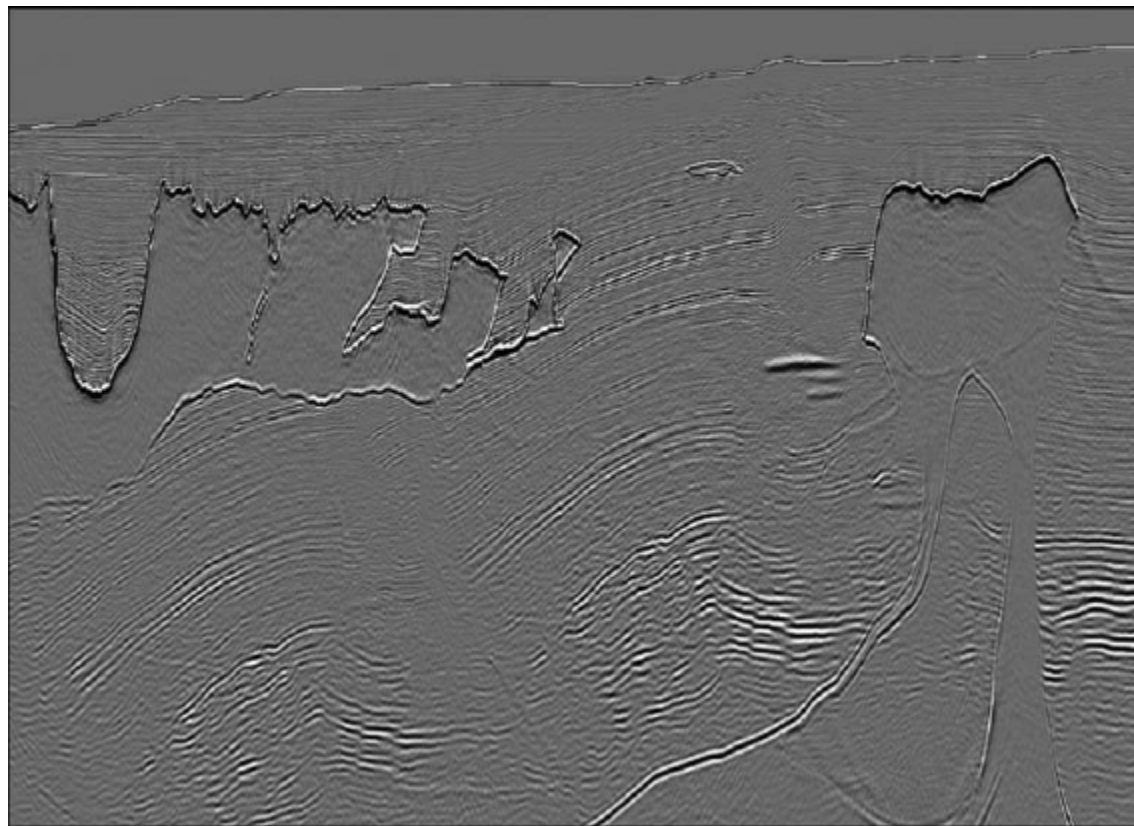
Etgen et al. (2009)

WEM (1-way)



Etgen et al. (2009)

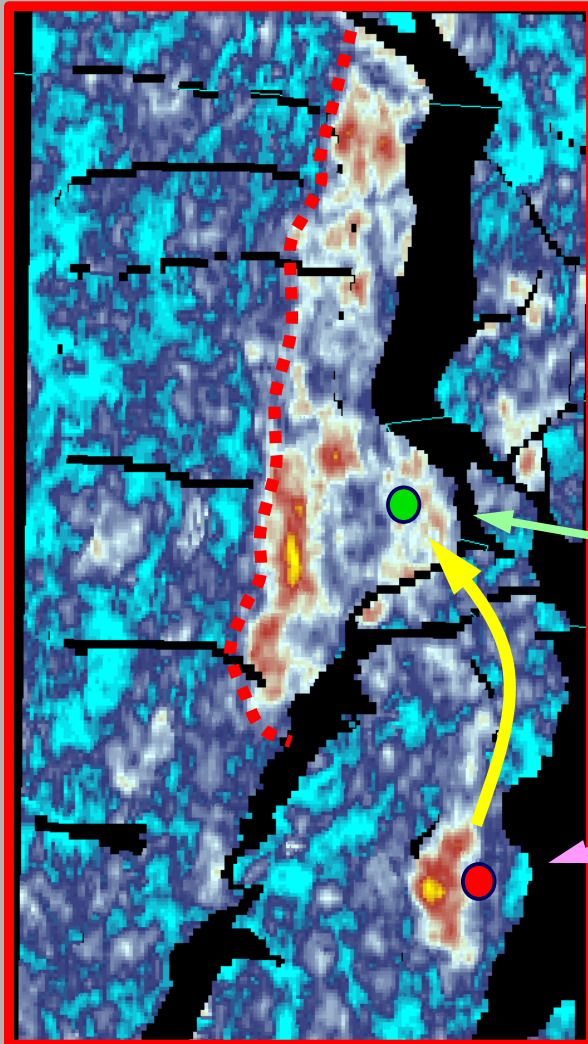
Reverse-time (RTM) (2-way)



Etgen et al. (2009)

Monitoring Production

characterize + predict

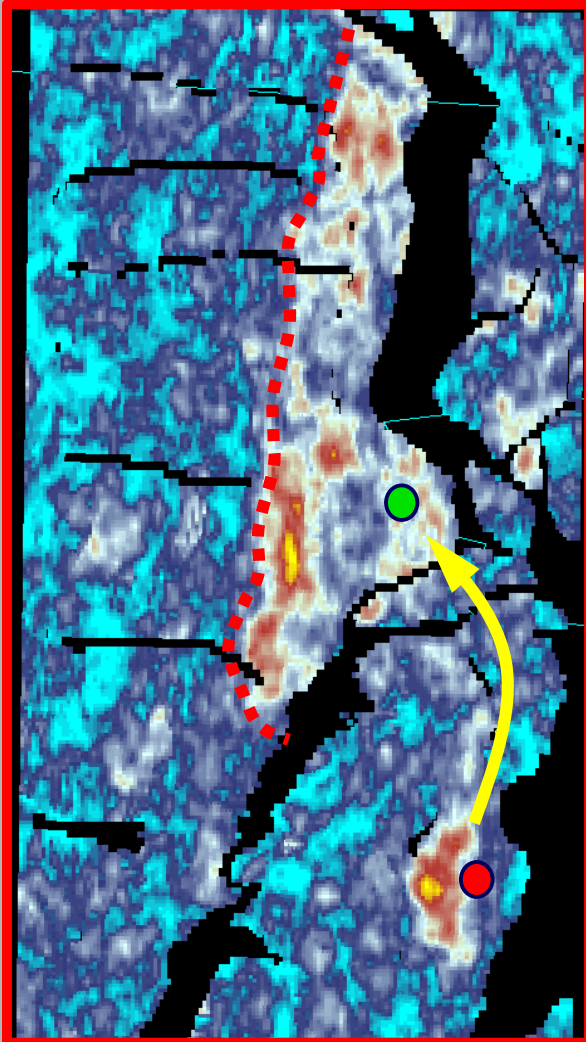


producer

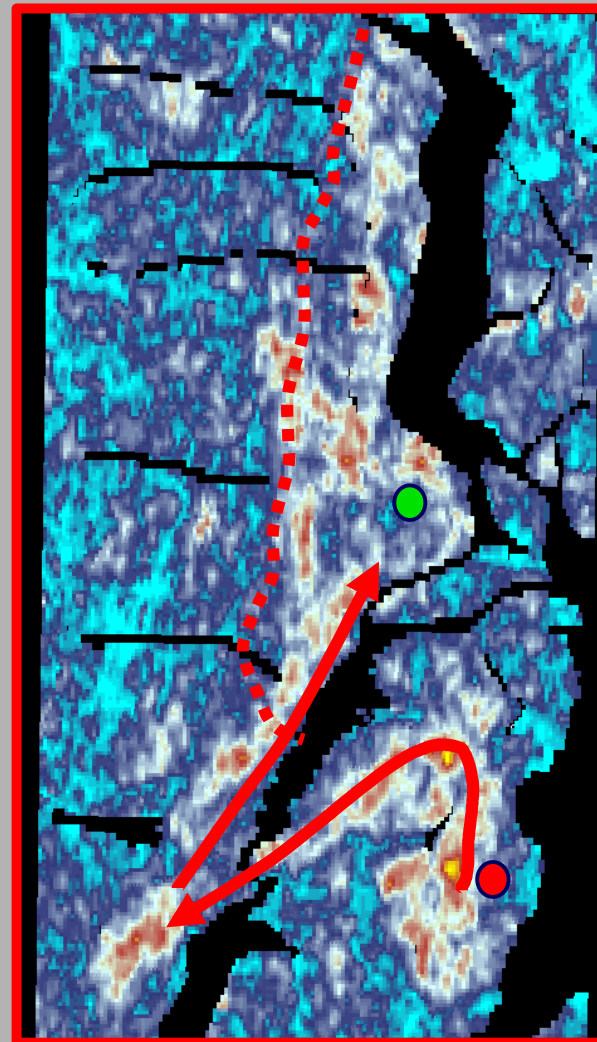
injector

Monitoring Production

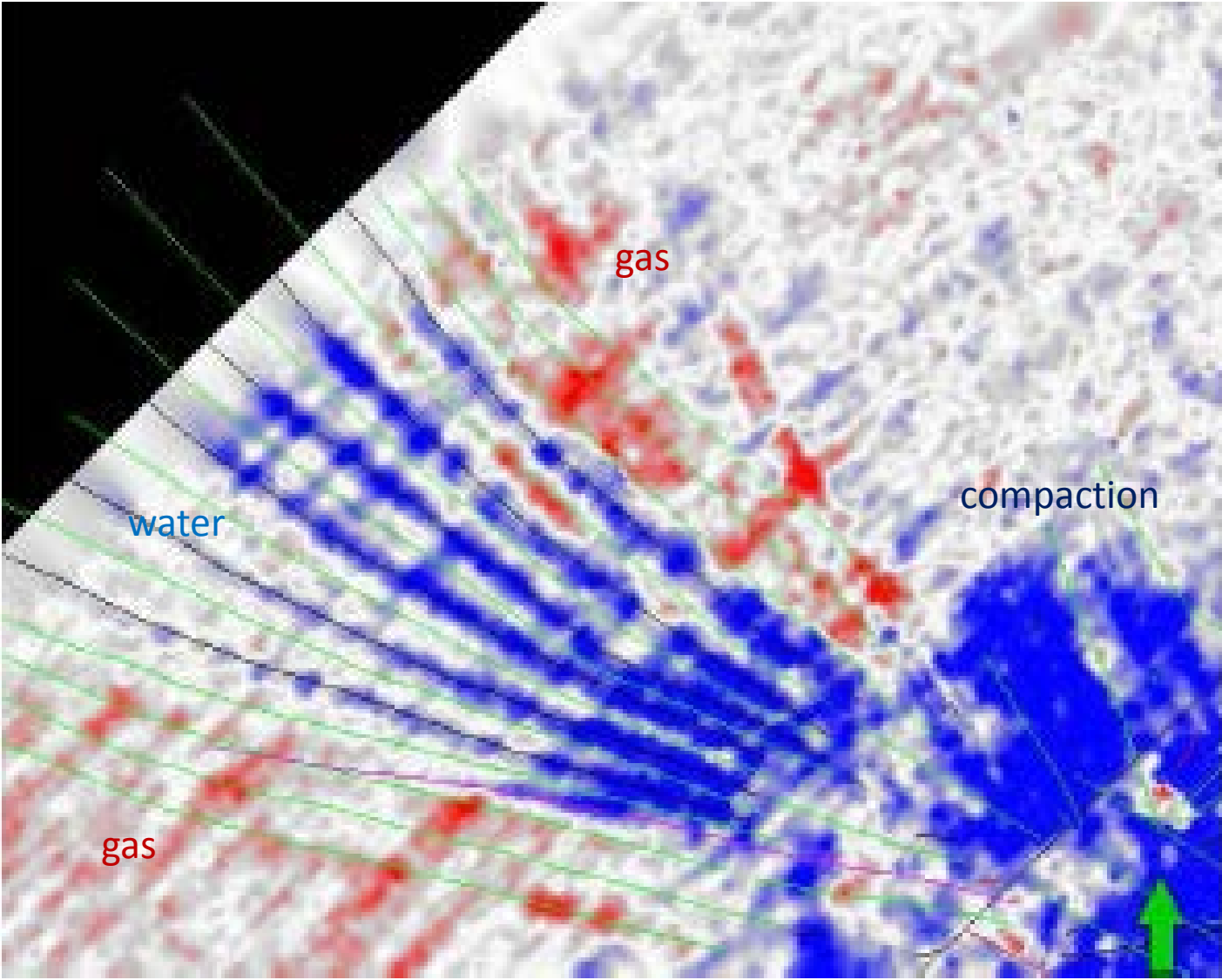
characterize + predict



monitor directly!



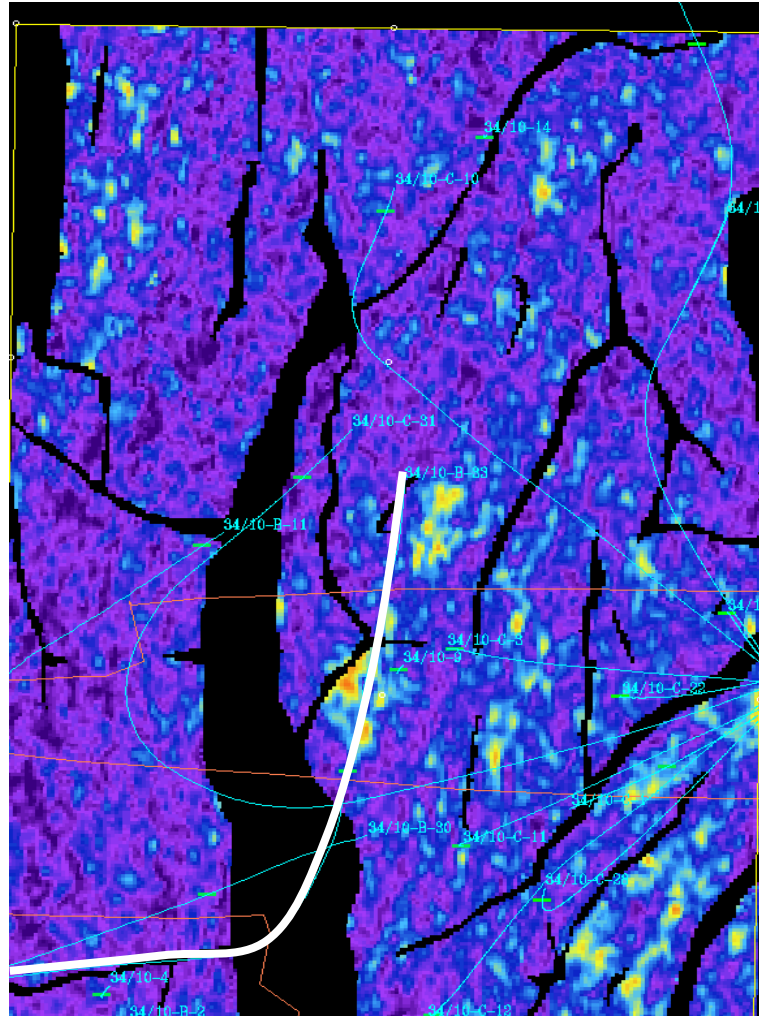
Fractured chalk reservoir



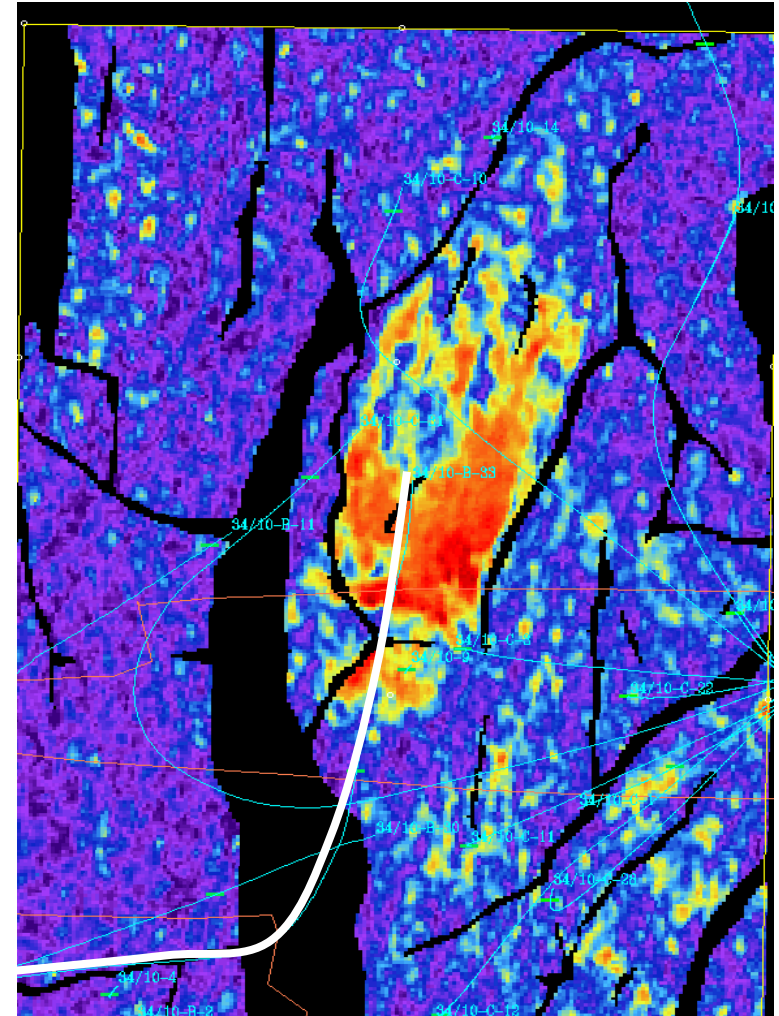
Gommesen et al., 2007

4D Seismic Pressure Anomaly

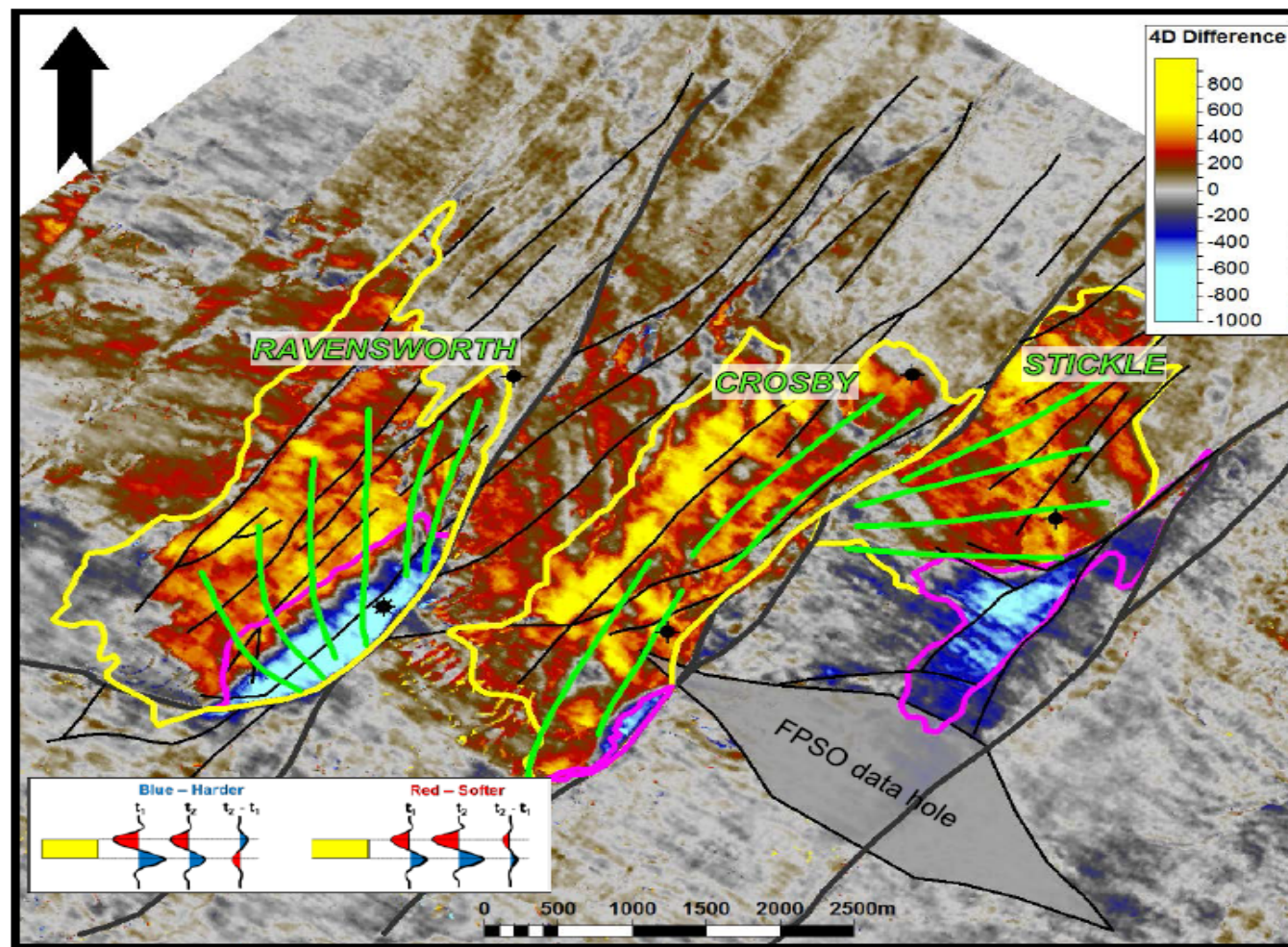
Before



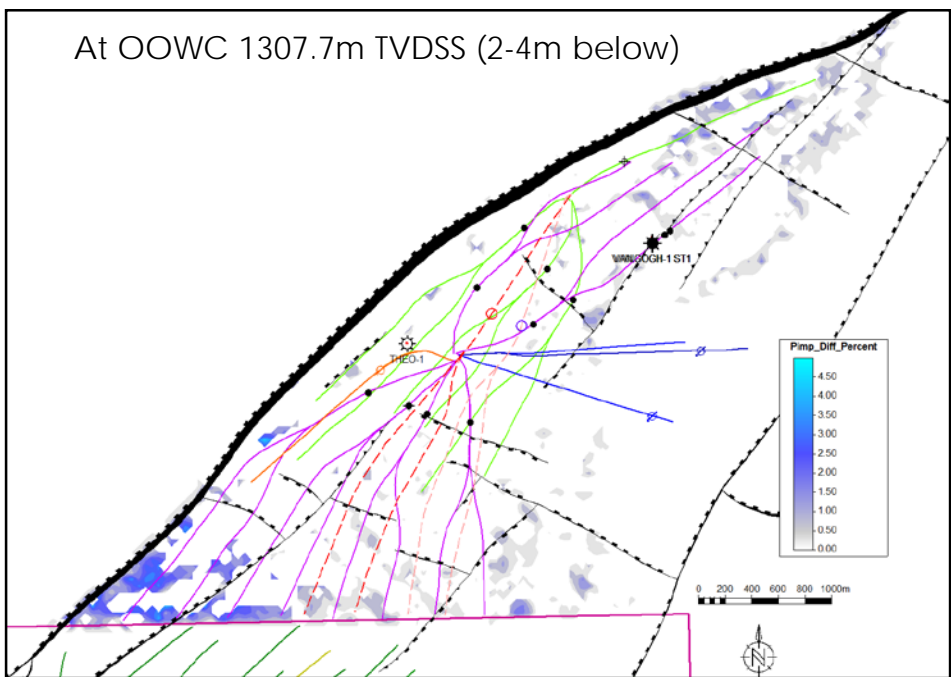
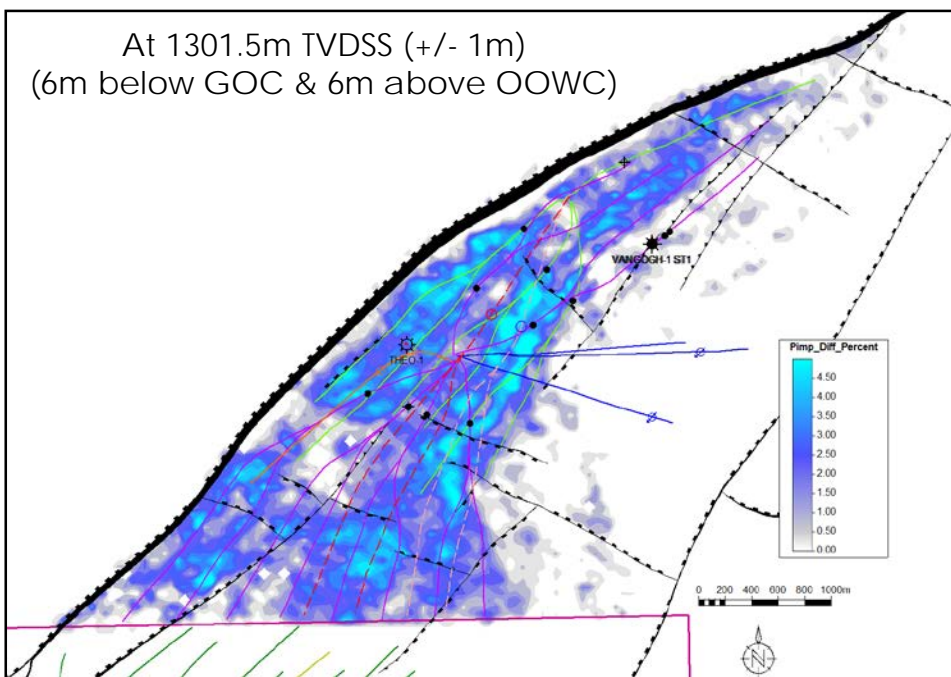
After



Full Angle Stack Monitor minus Baseline

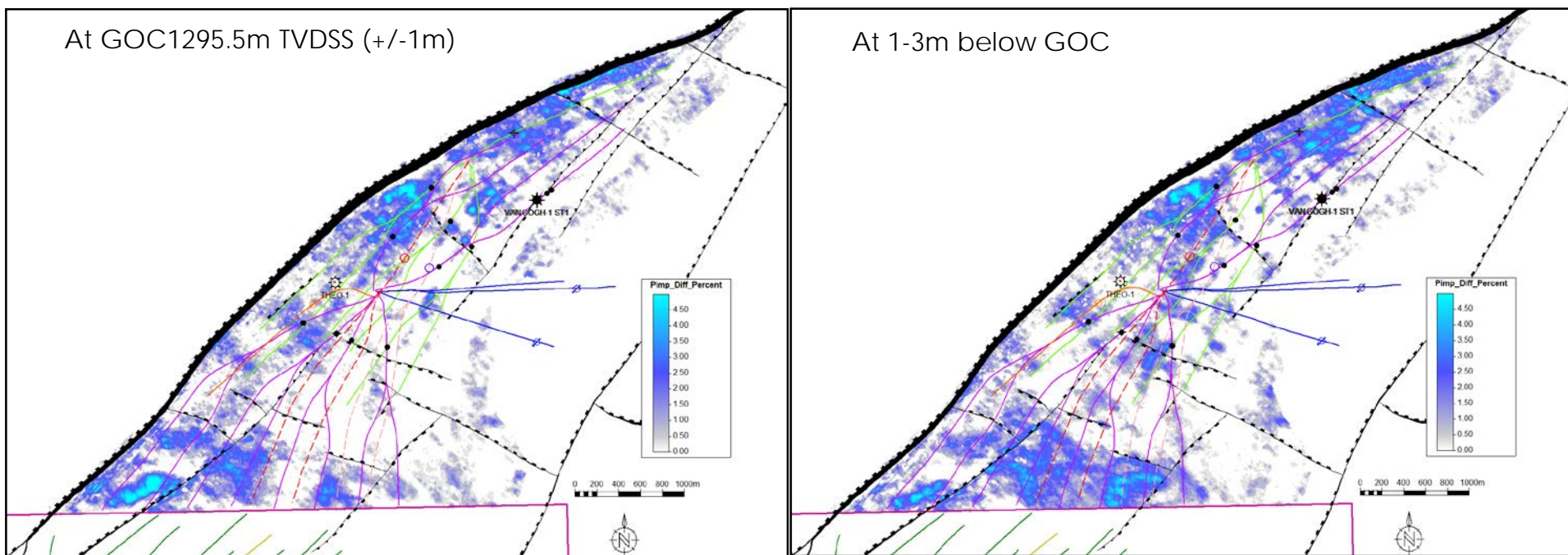


van GOGH: P-IMP 4D_{DIFF} %



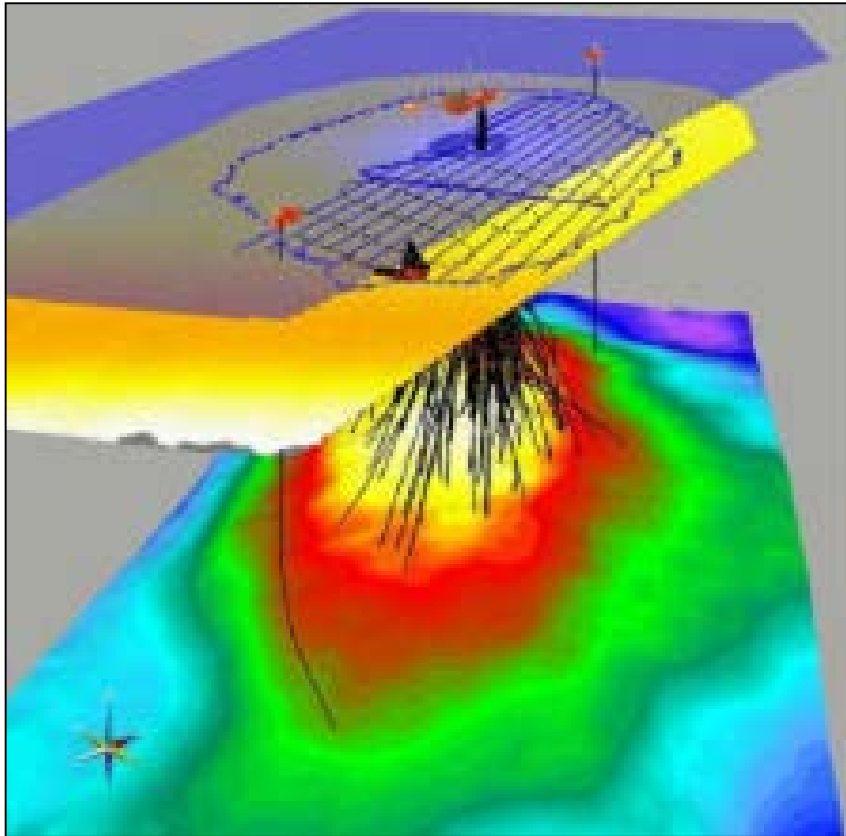
Bouloudas et al., Quadrant, 2015

van GOGH: P-IMP 4D_{DIFF} %

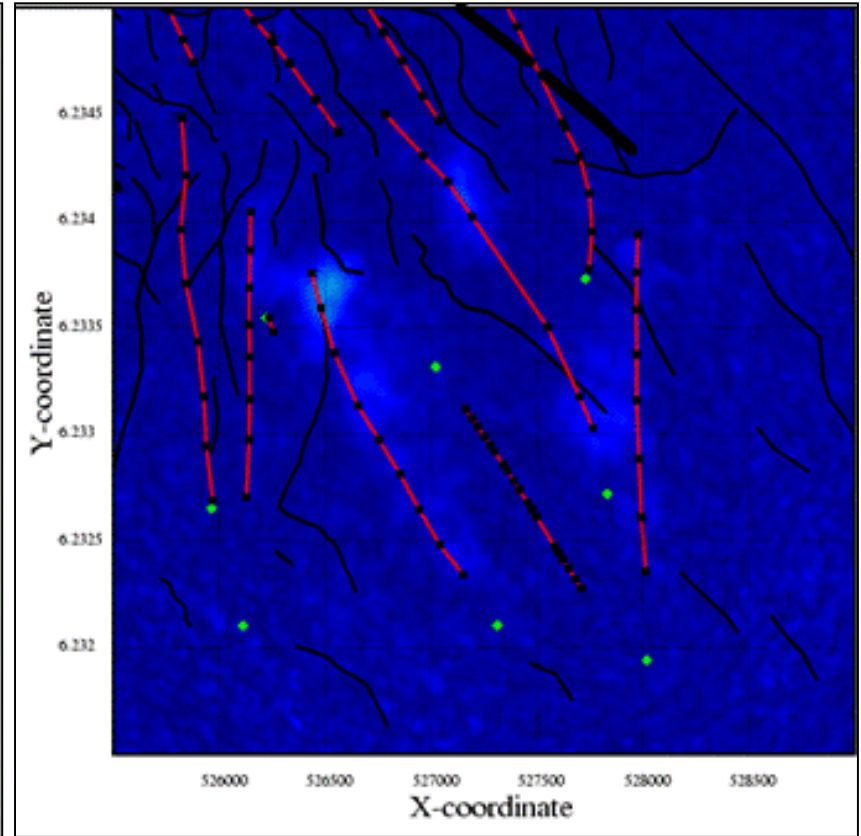


Bouloudas et al., Quadrant, 2015

Valhall permanent seafloor array



Barkved et al., 2004



courtesy BP

3D + 4D Seismic Inversion

Inverse theory (inversion)

$$d = F(m) ; m = F^{-1}(d)$$

d = data

m = model

F = physics

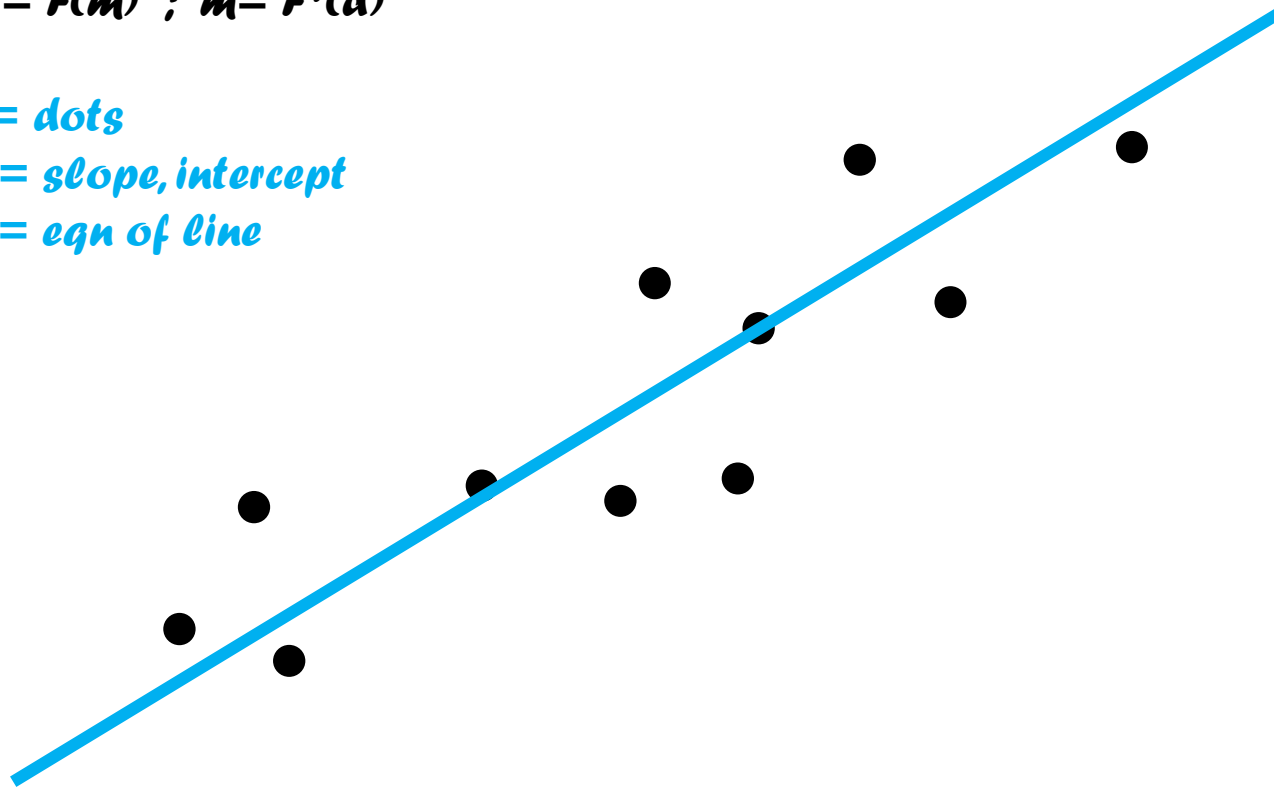
Inverse theory (inversion)

$$d = F(m) ; m = F^{-1}(d)$$

d = dots

m = slope, intercept

F = eqn of line



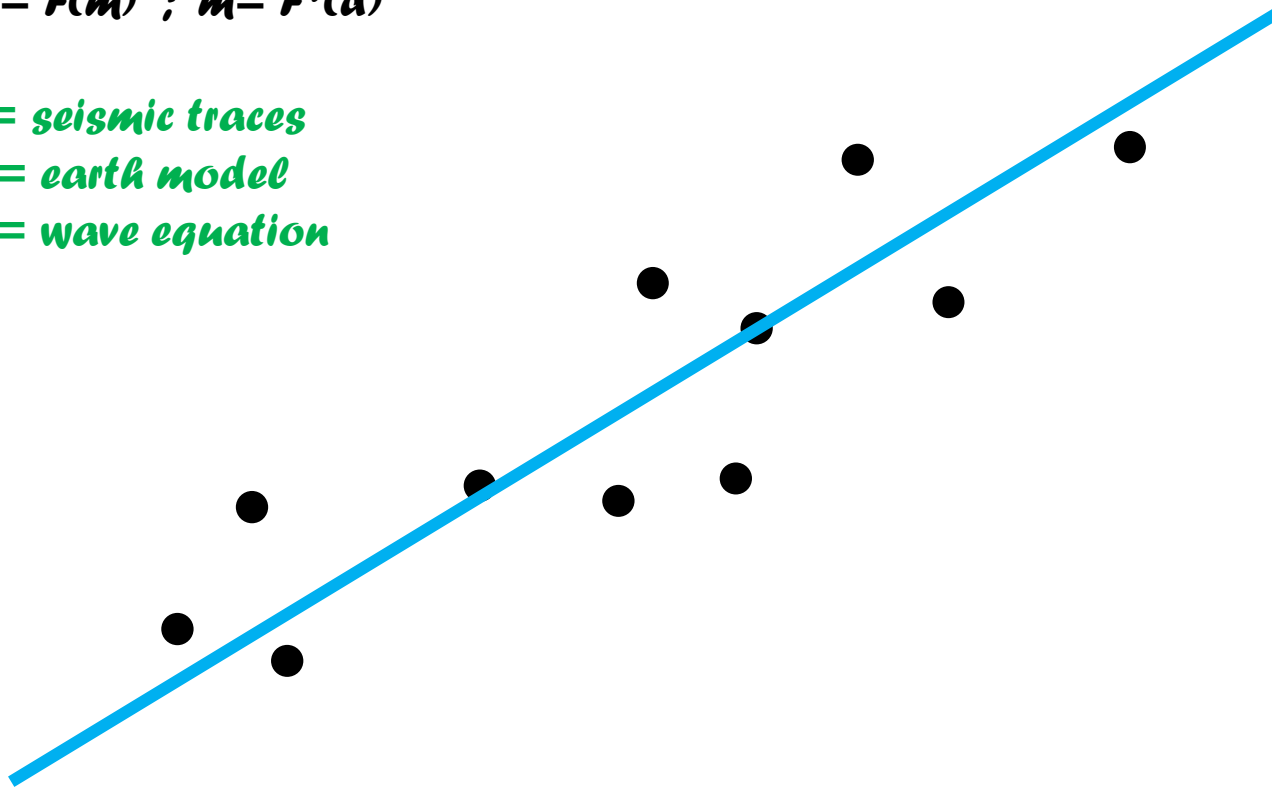
Inverse theory (inversion)

$$d = F(m) ; m = F^{-1}(d)$$

d = seismic traces

m = earth model

F = wave equation



Scalar wave equation modeling

$$d = \mathcal{F}m$$

$$(v^2 \nabla^2 - \partial_{tt}) P(\underline{x}, t) = 0$$

$$\begin{aligned}
 m &= v(\underline{x}) \\
 \mathcal{F} &= \nabla^2 - \partial_{tt} \\
 d &= P(\underline{x}, t)
 \end{aligned}$$

Full waveform inversion

$$\mathbf{m} = \mathbf{F}^{-1}\mathbf{d}$$

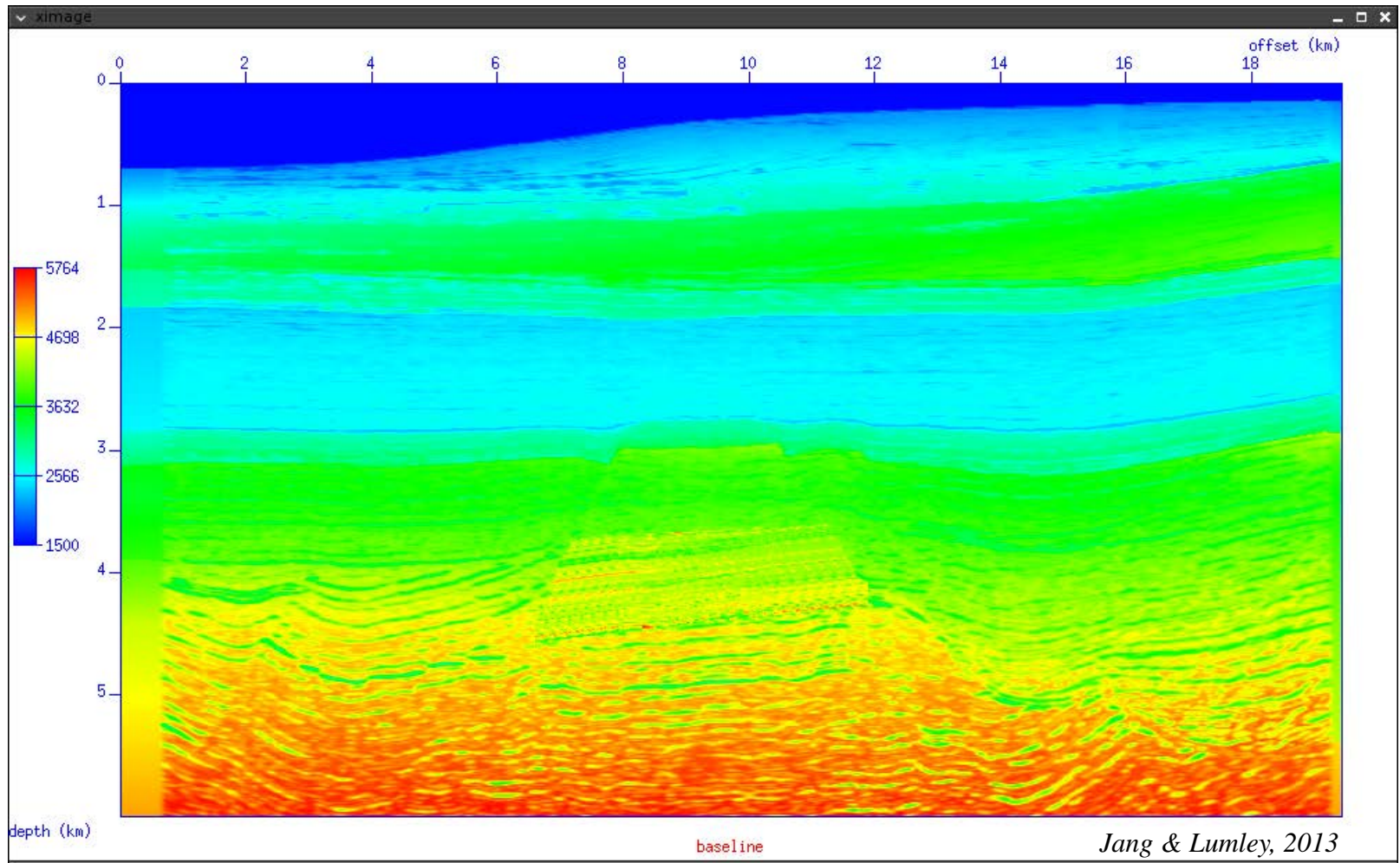
$$\min \mathbf{e}^2 = w_d^2 (\mathbf{d} - \mathbf{F}\mathbf{m})^2 + w_m^2 (\mathbf{m} - \mathbf{m}_0)^2 + \dots$$

subject to constraints: $\nabla \mathbf{m} \approx \mathbf{0}$ etc...

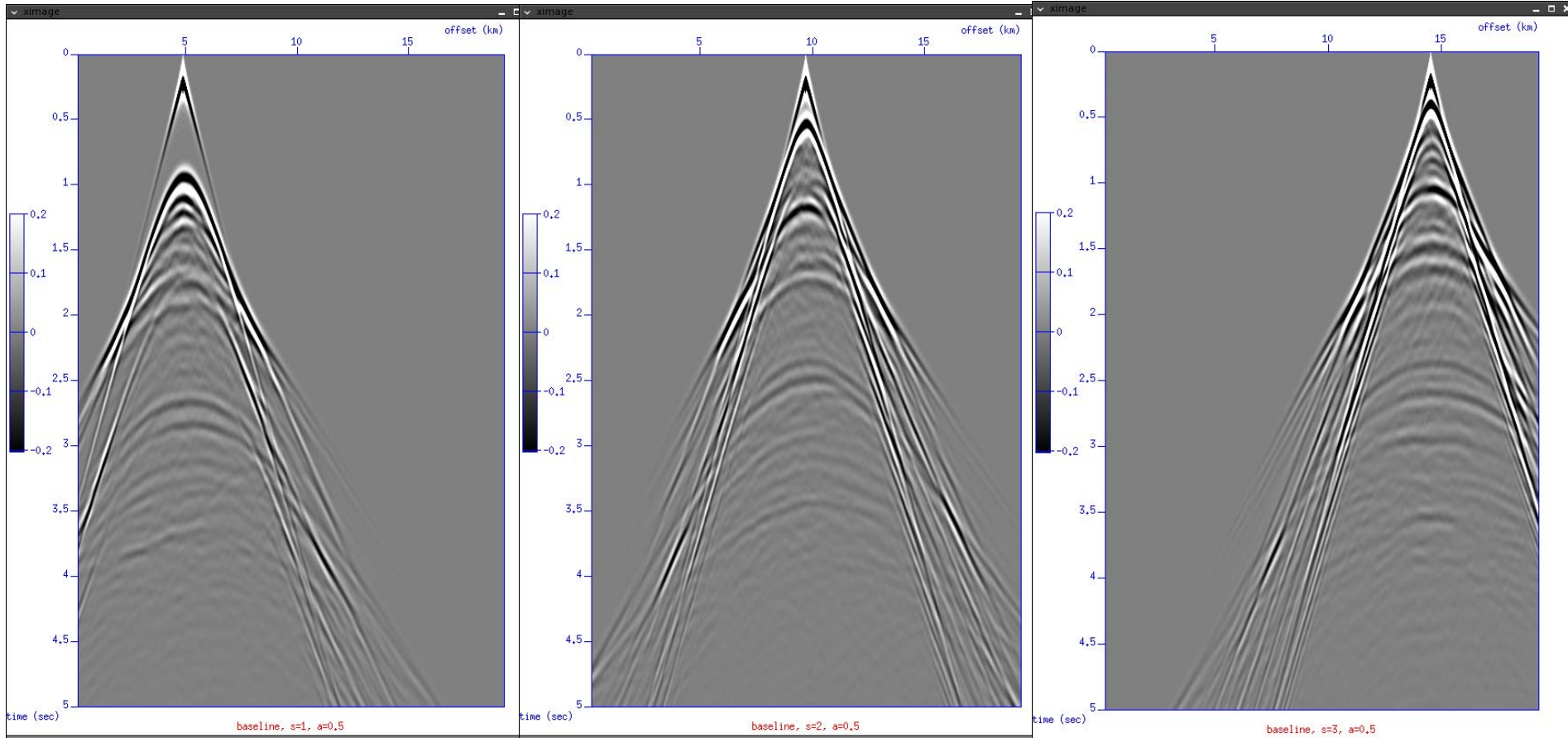
\mathbf{F} 2-way WEQ modeling operator

\mathbf{m} 2D/3D elastic/velocity model

True velocity model

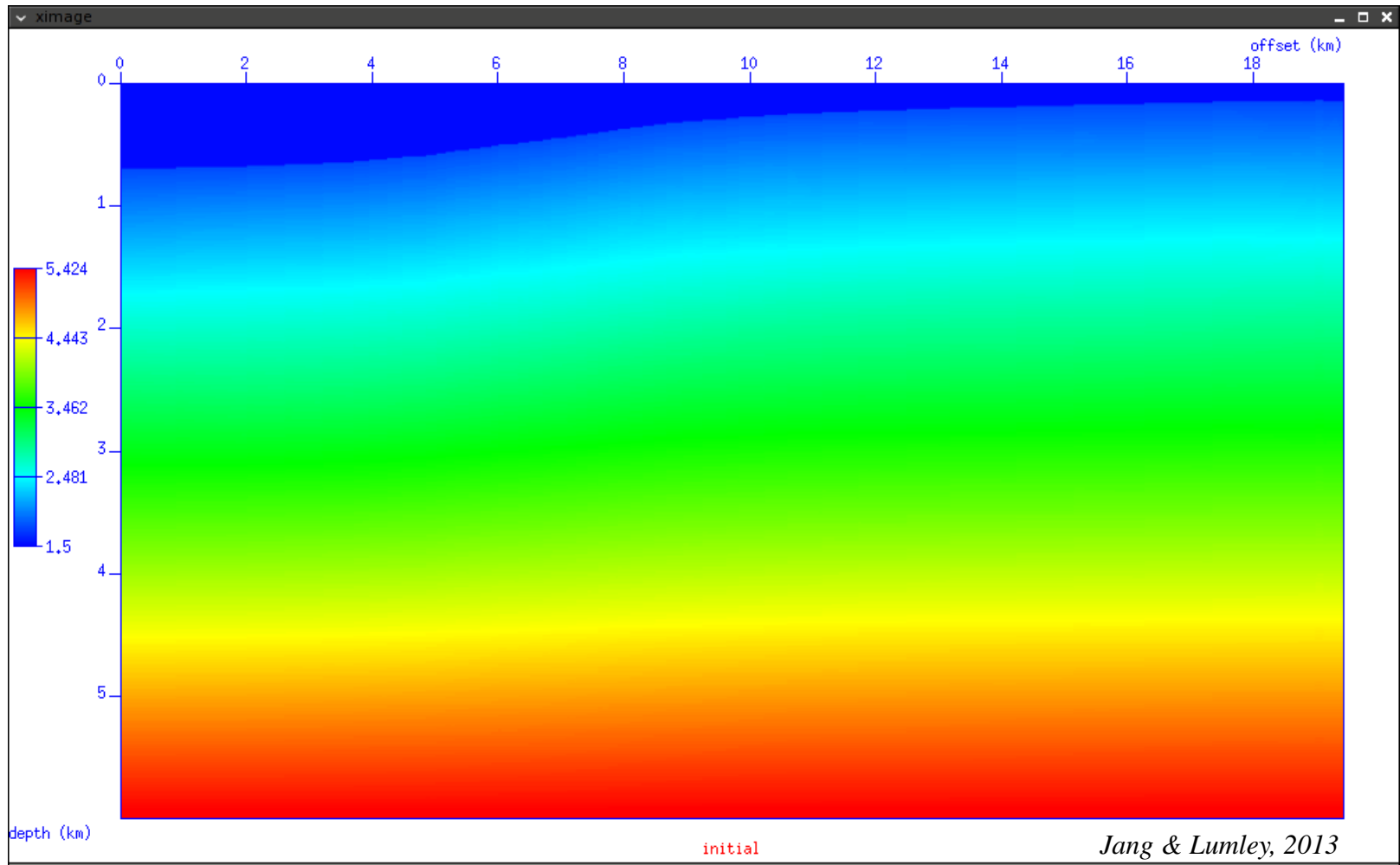


Seismic shot gathers

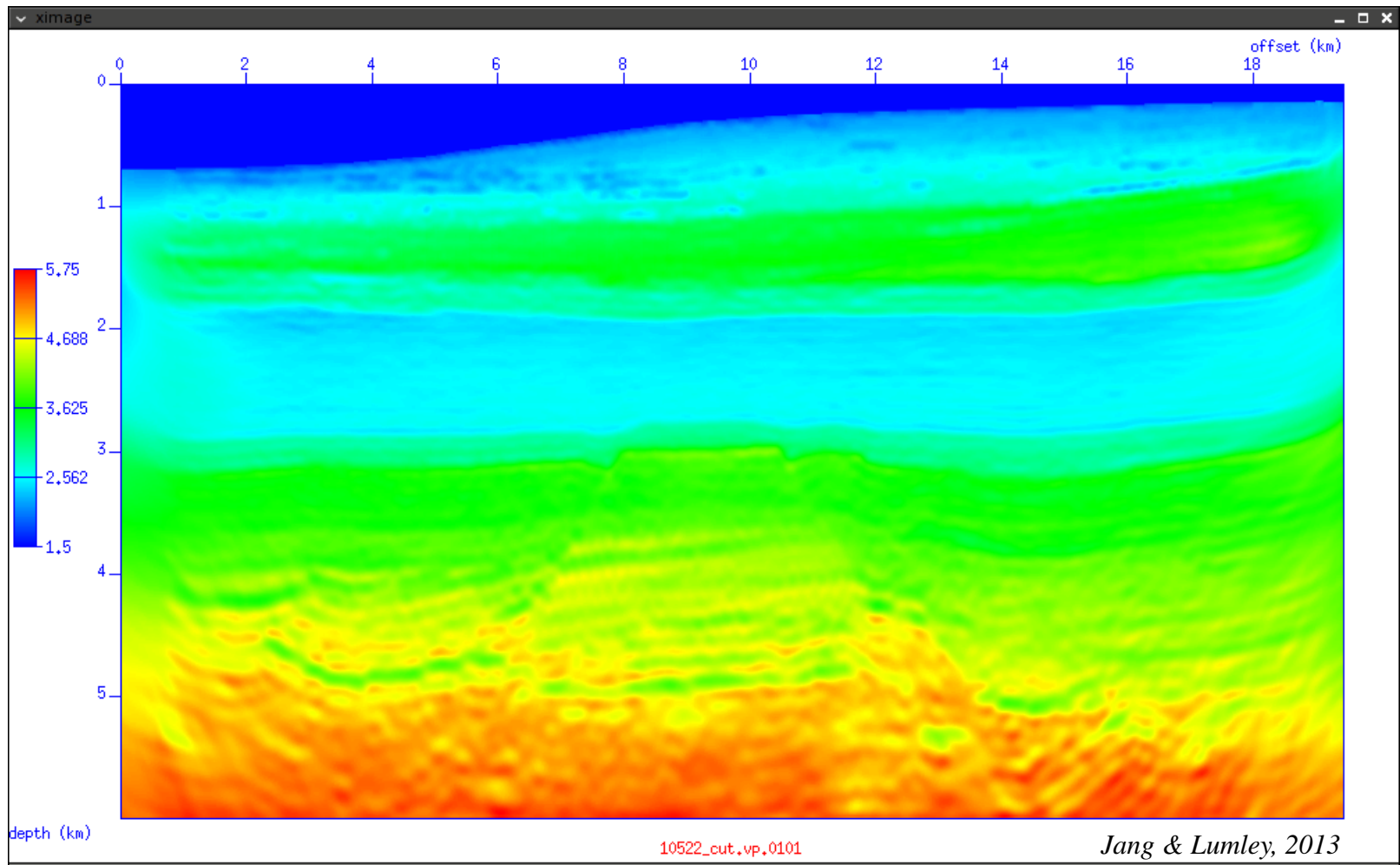


Jang & Lumley, 2013

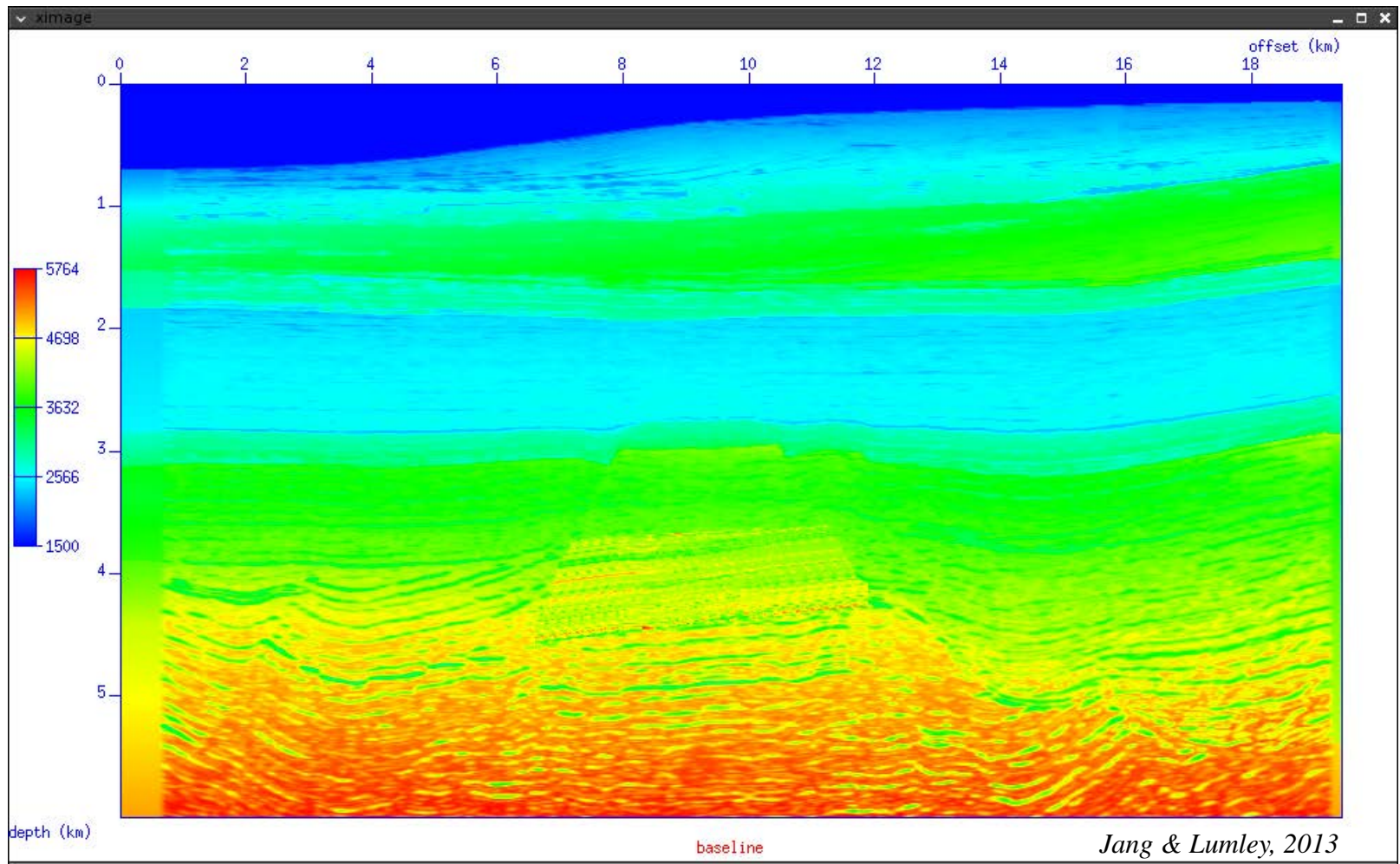
Initial velocity model



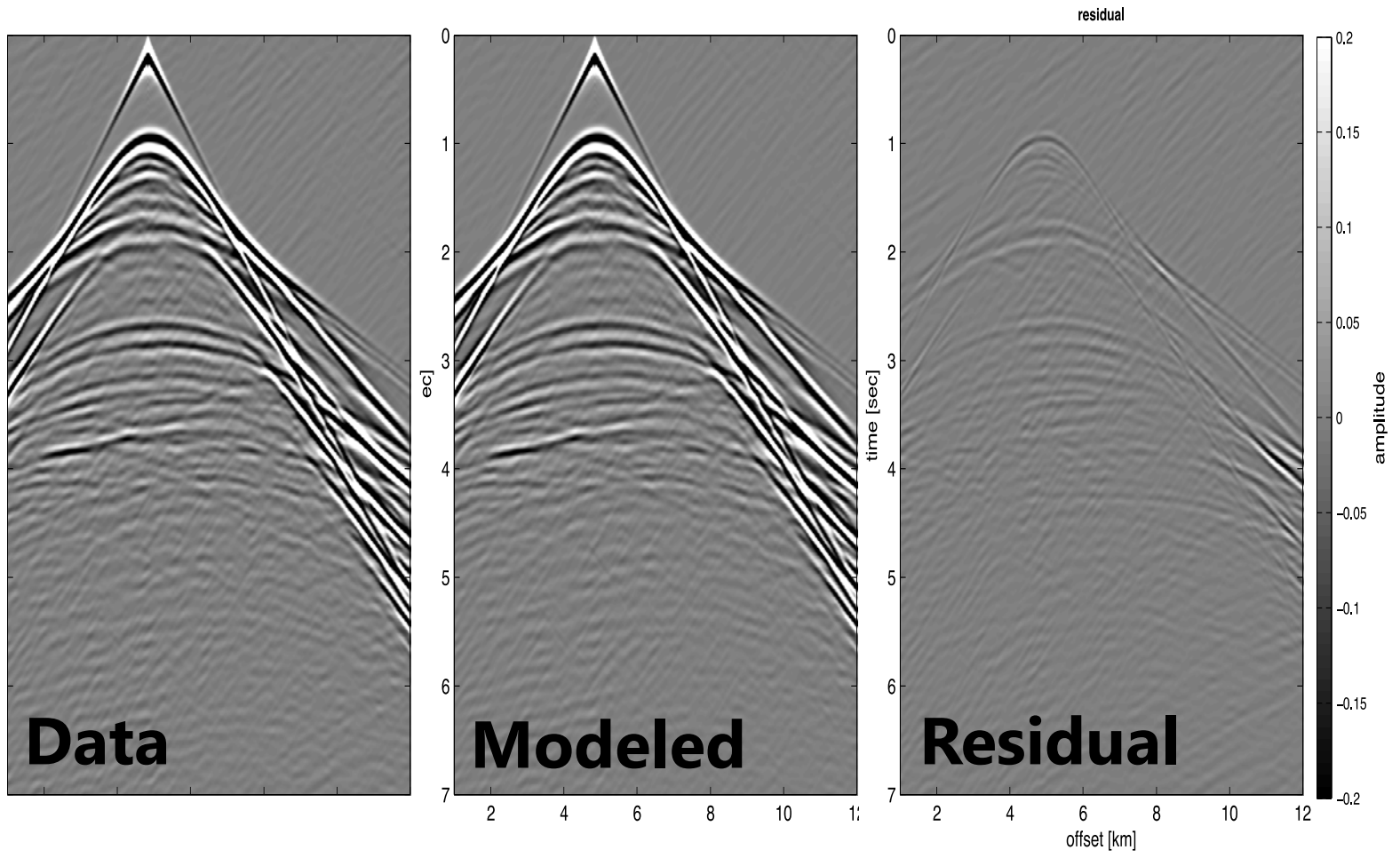
Inverted velocity model



True velocity model



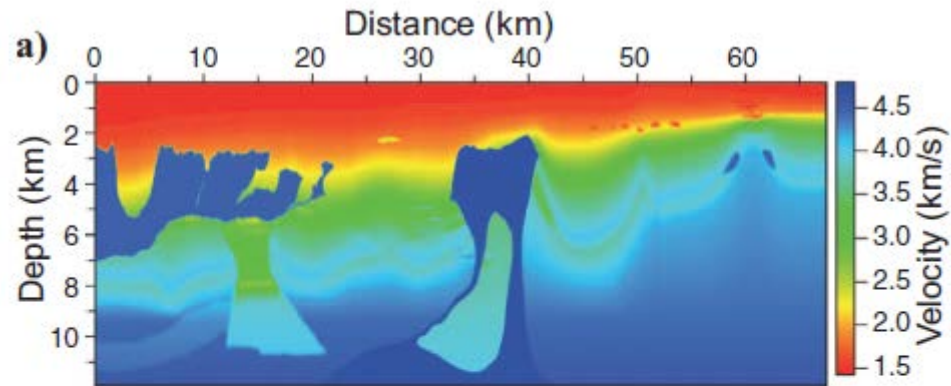
Seismic shot gathers



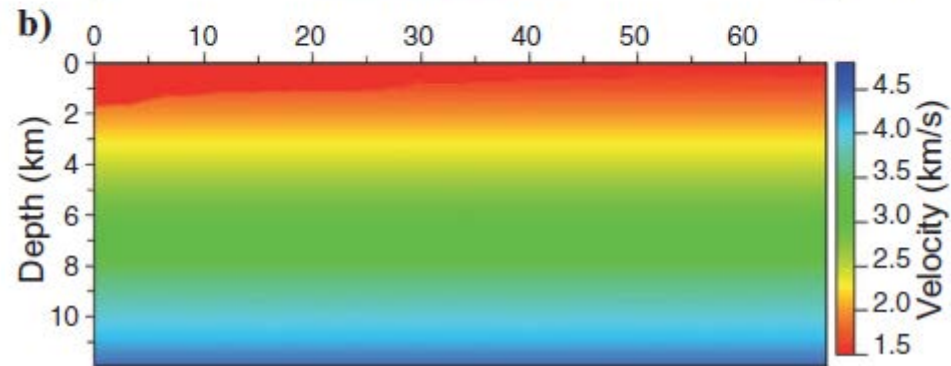
Jang & Lumley, 2013

Full waveform inversion

true model



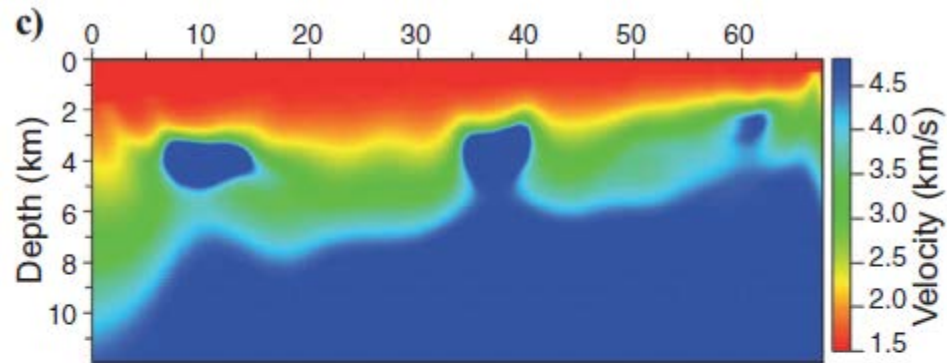
initial model



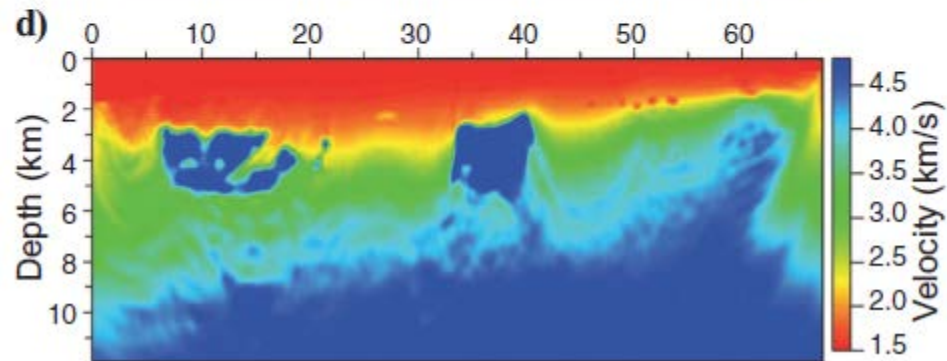
Shin & Cha 2009

Full waveform inversion

Laplace



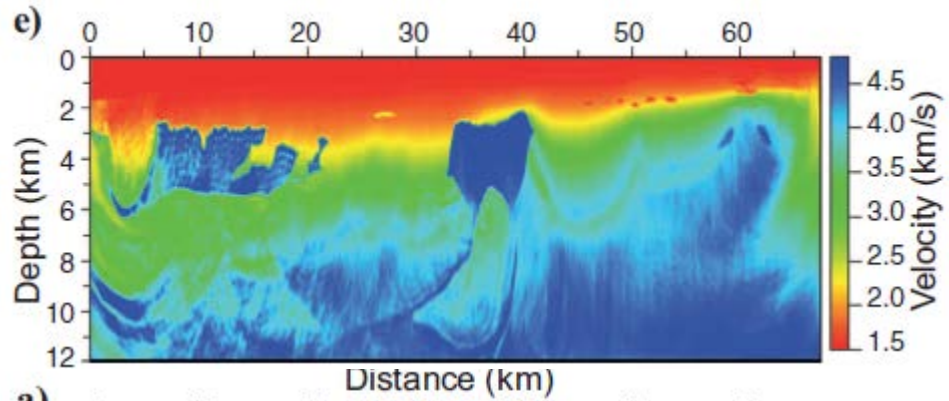
Laplace+Fourier



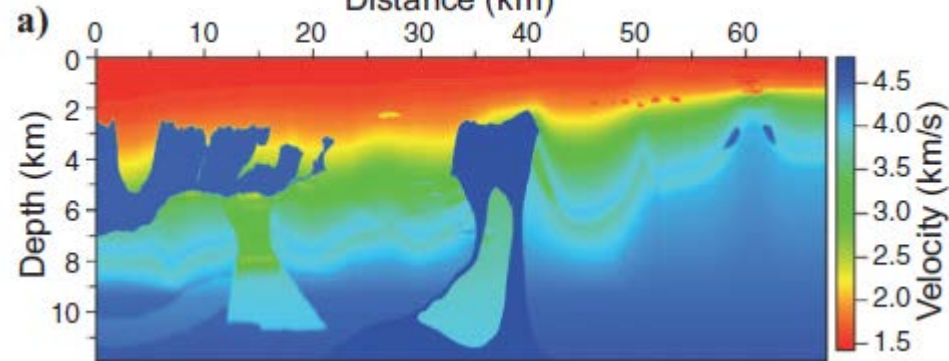
Shin & Cha 2009

Full waveform inversion

+Fourier



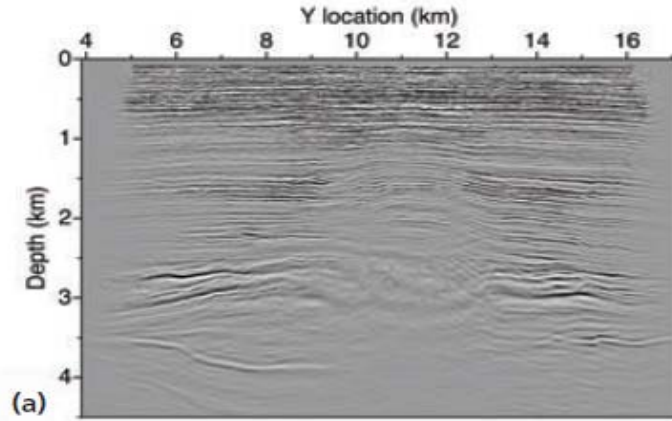
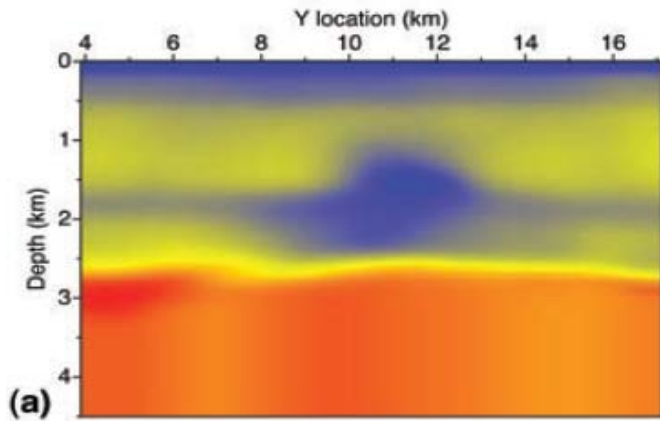
true model



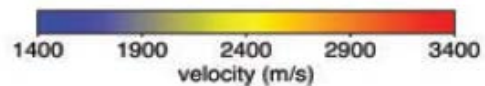
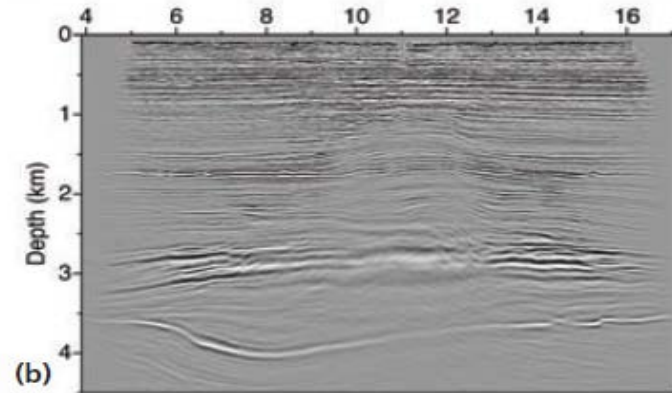
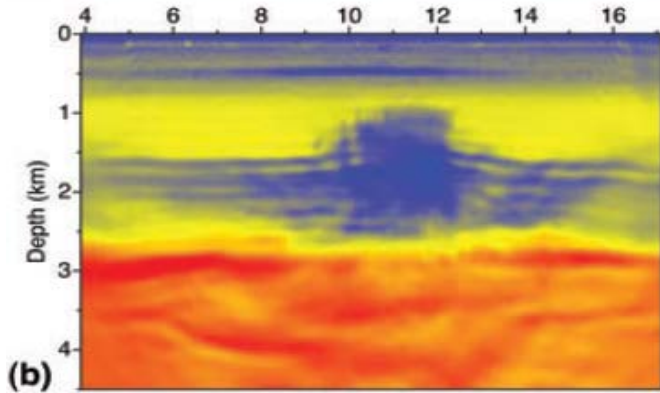
Shin & Cha 2009

Full waveform inversion

MVA



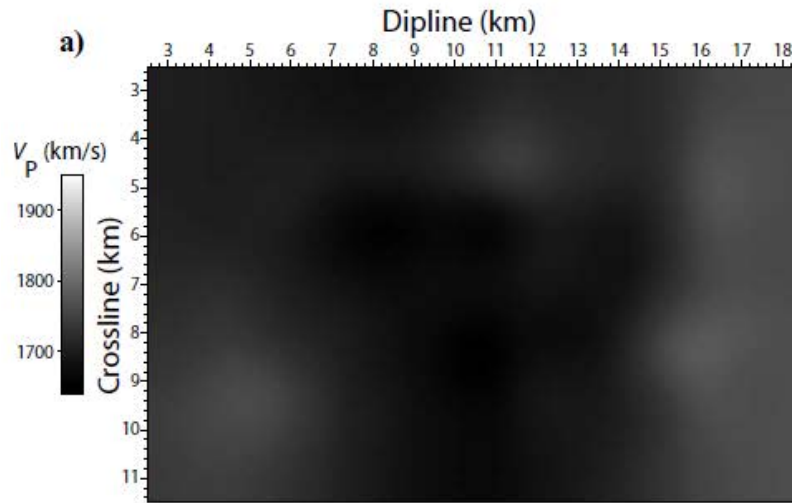
FWI



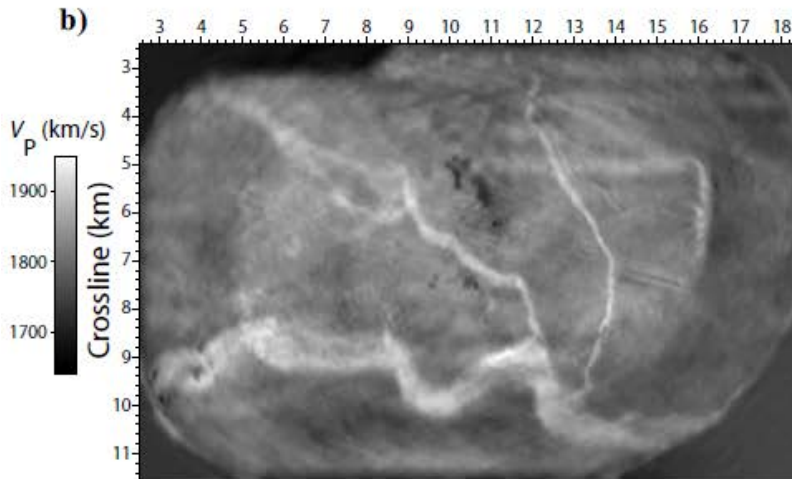
Sirgue et al. 2010

Full waveform inversion

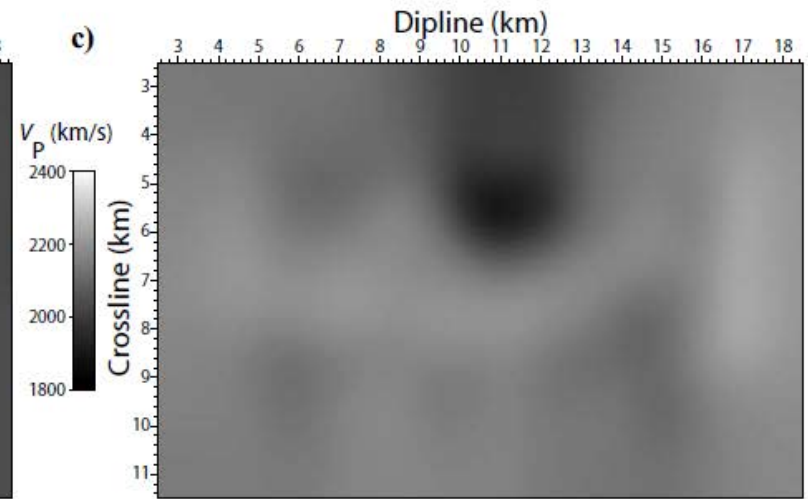
Tomo



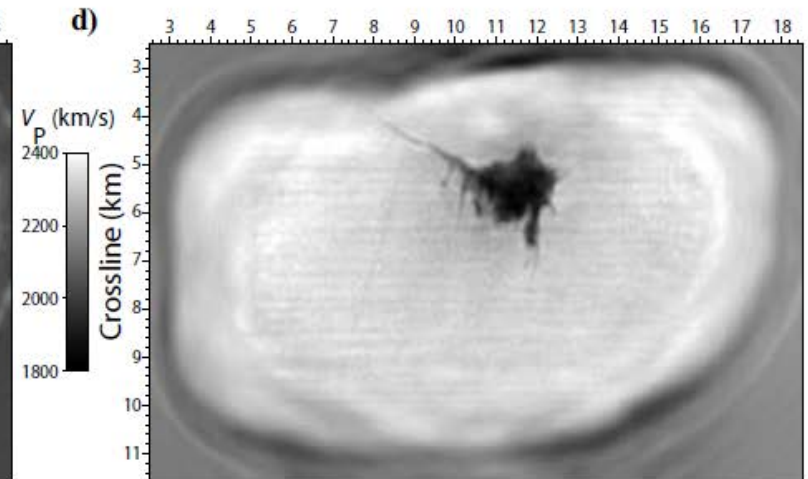
FWI



c)

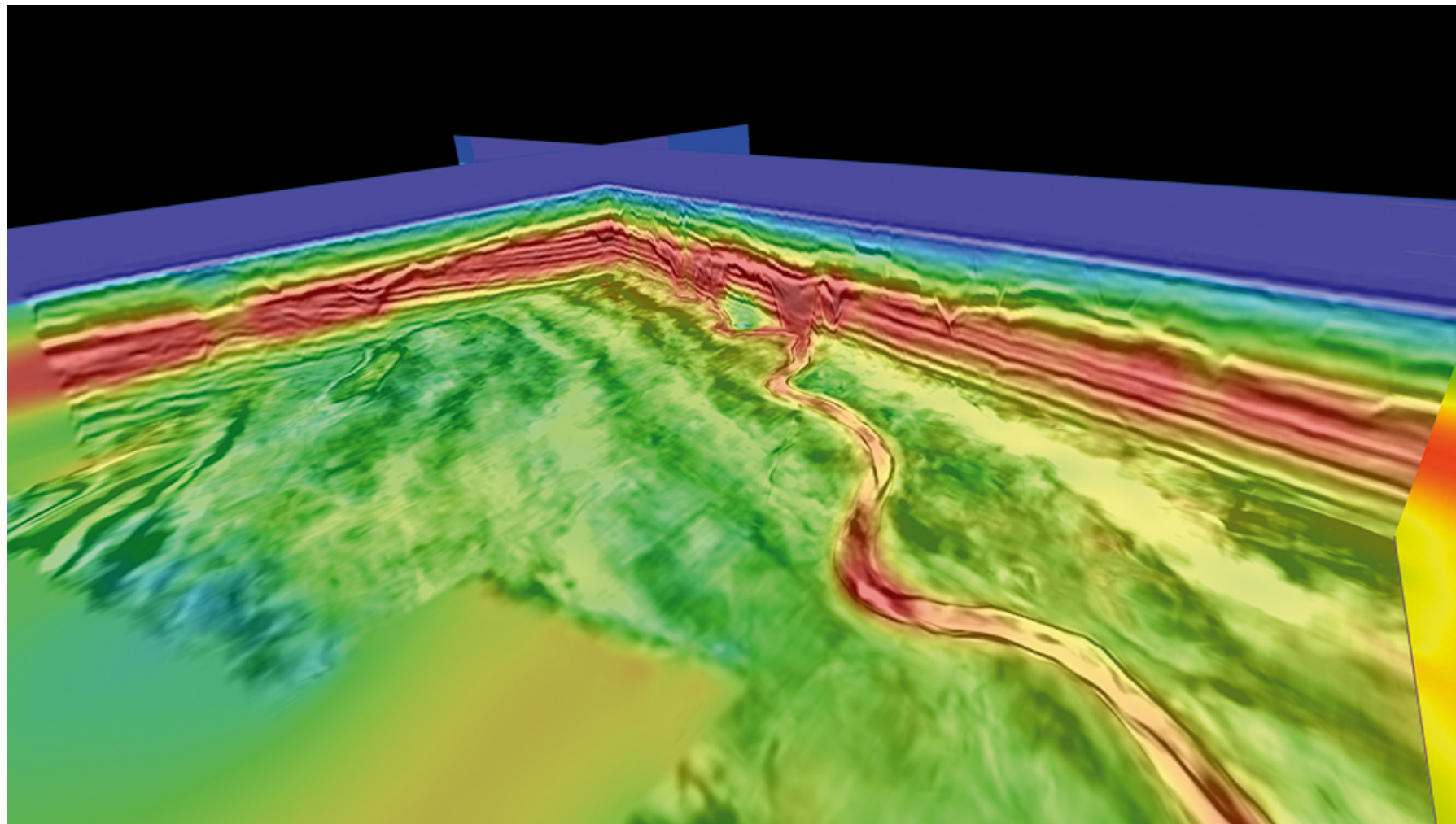


d)



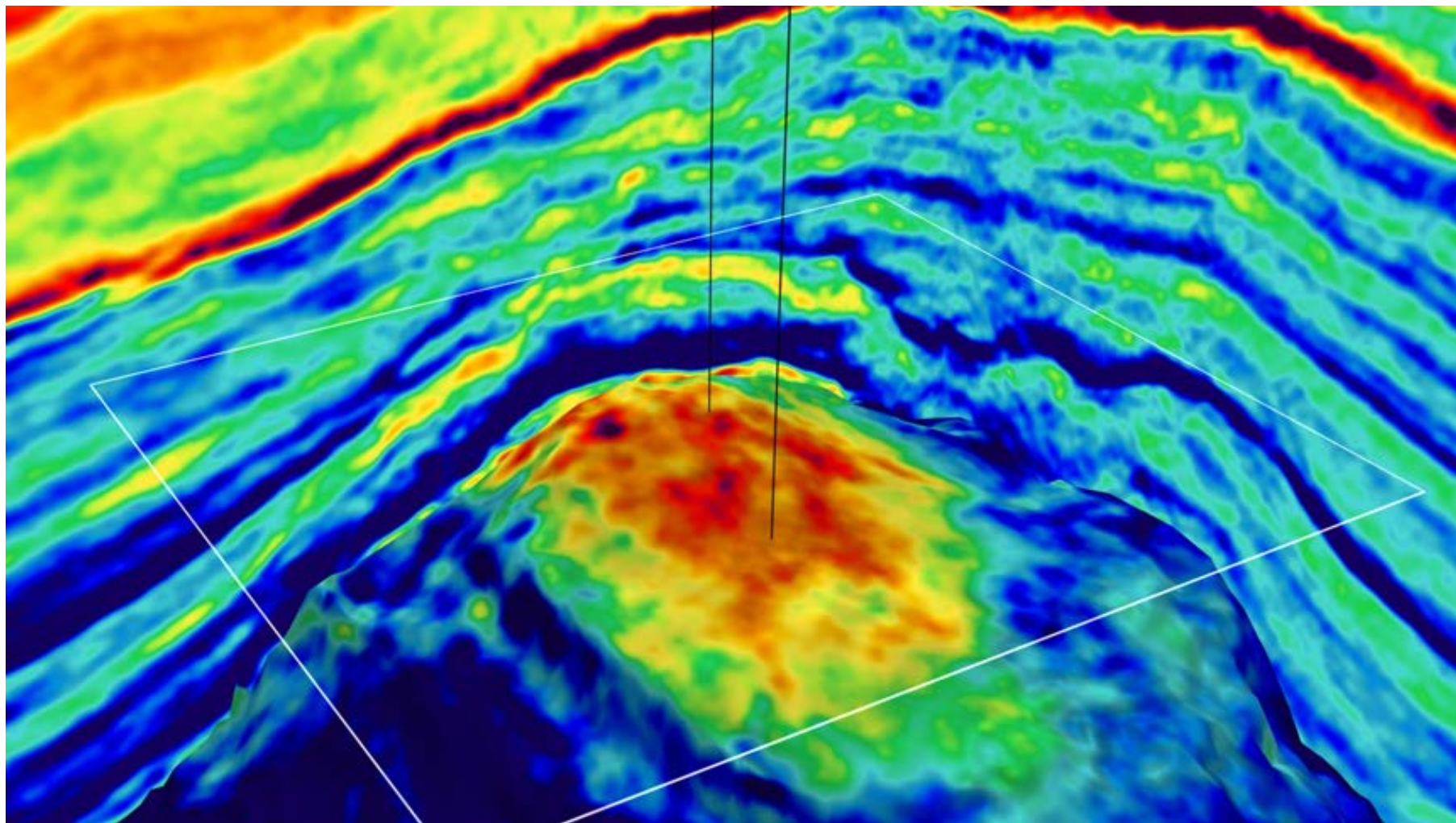
Sirgue & Barkved

Full waveform inversion



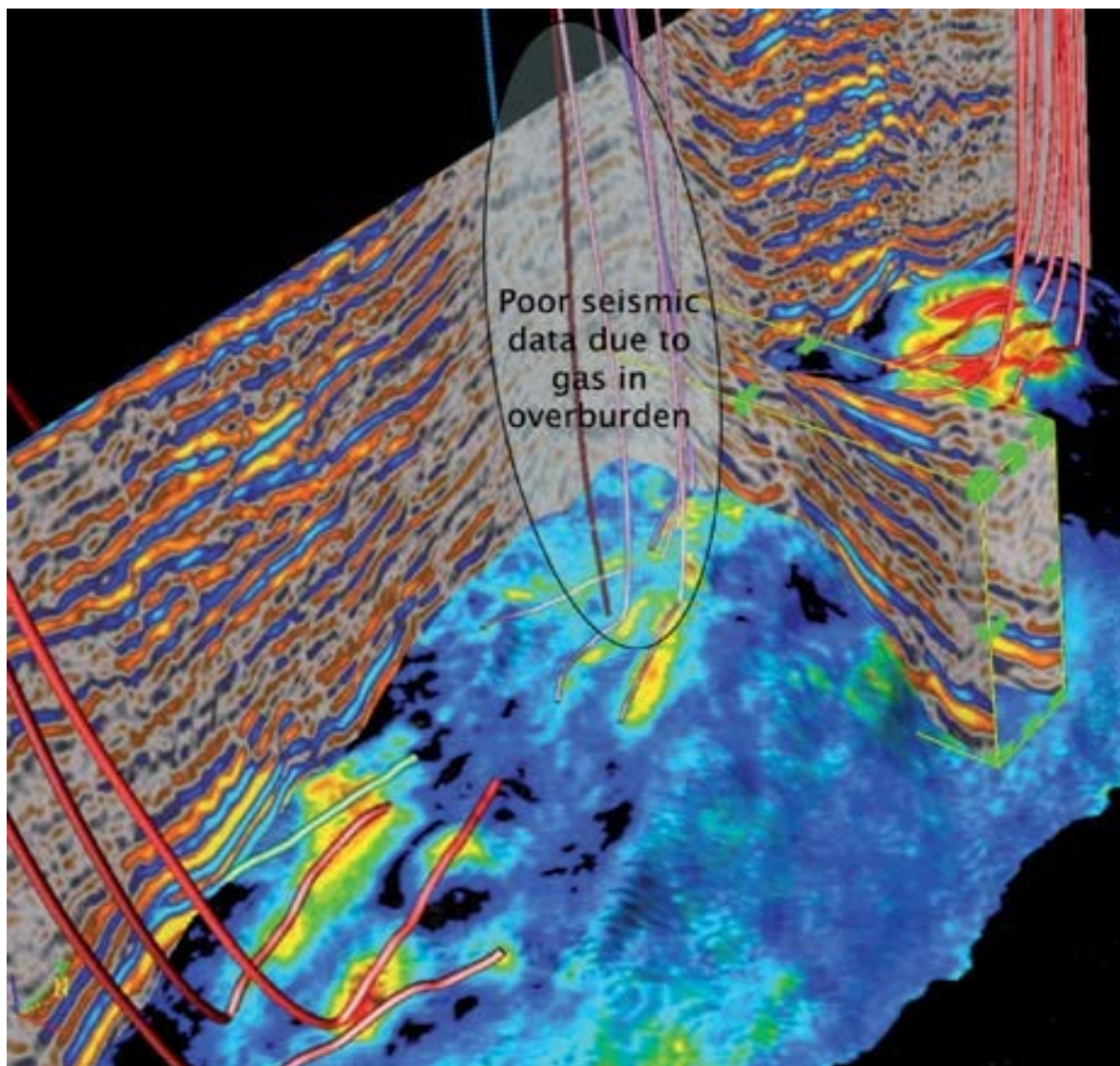
PGS

Full waveform inversion

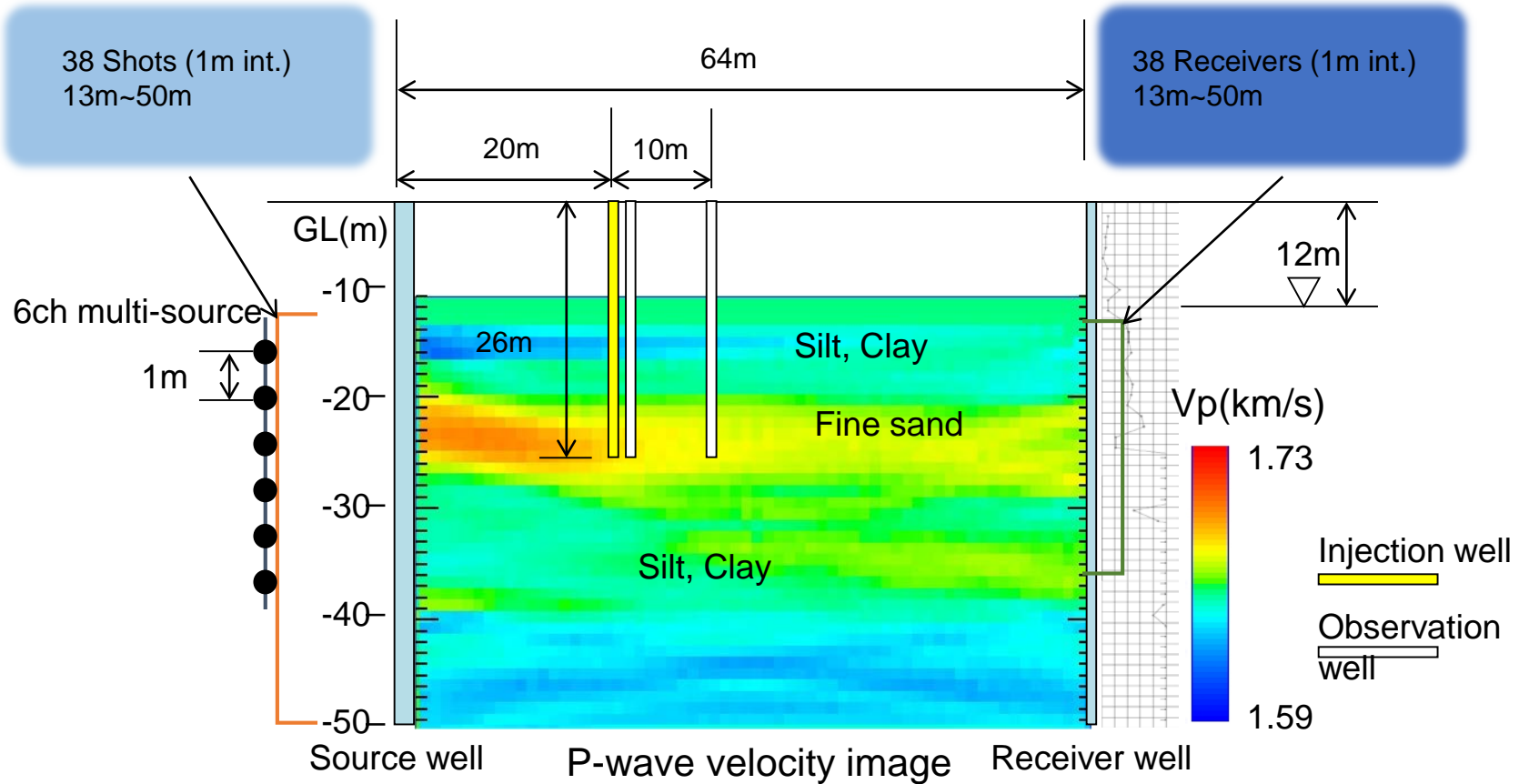


PGS

Full waveform inversion

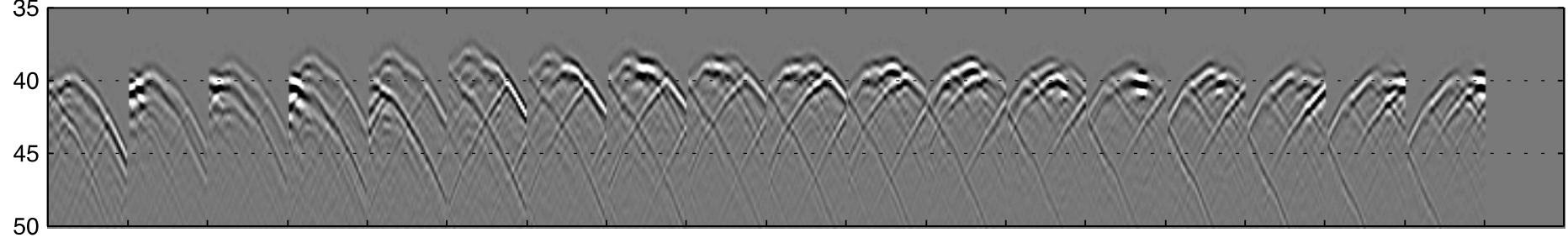


Cross-well FWI

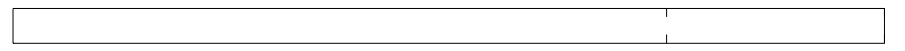
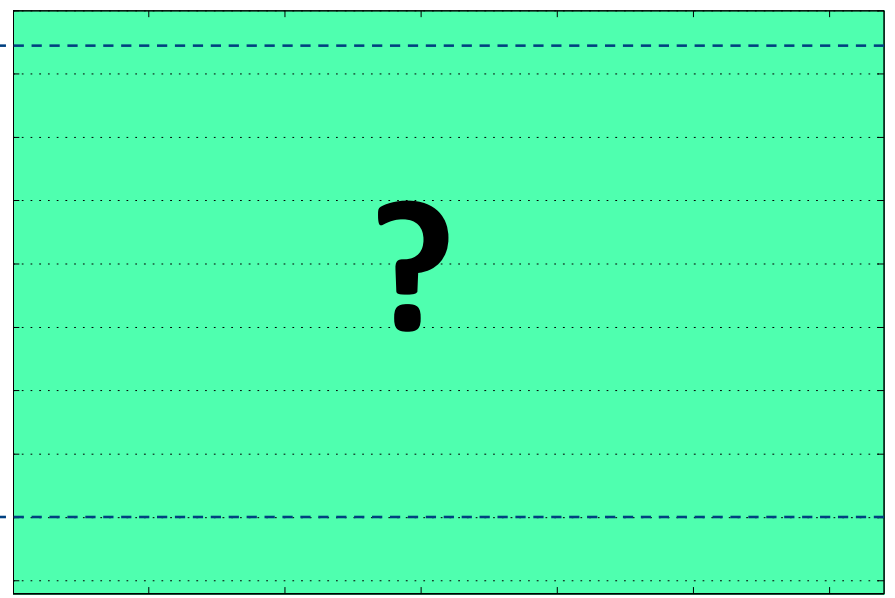
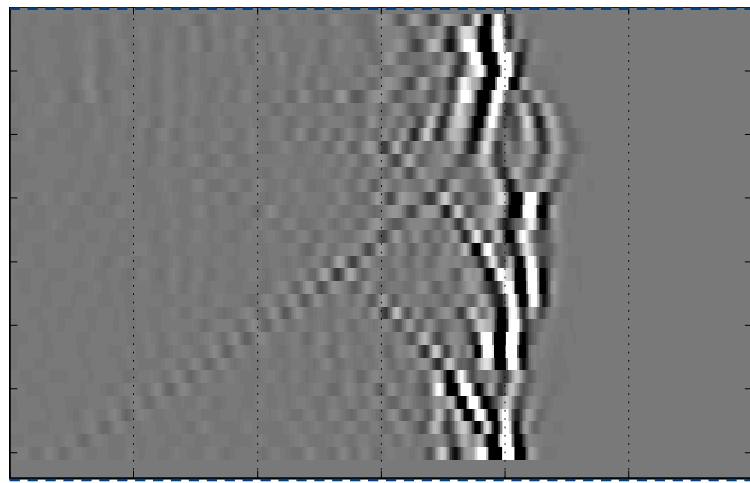


Cross-well data (real)

Baseline (00h.1kHz) : damping / muting / low-pass (1500Hz) / amplitude correction (manual)

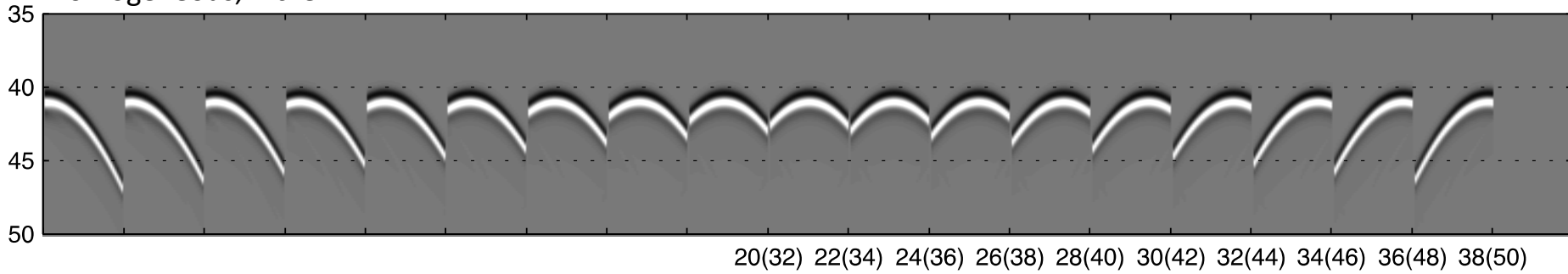


Same level section: Baseline (00h.1kHz)

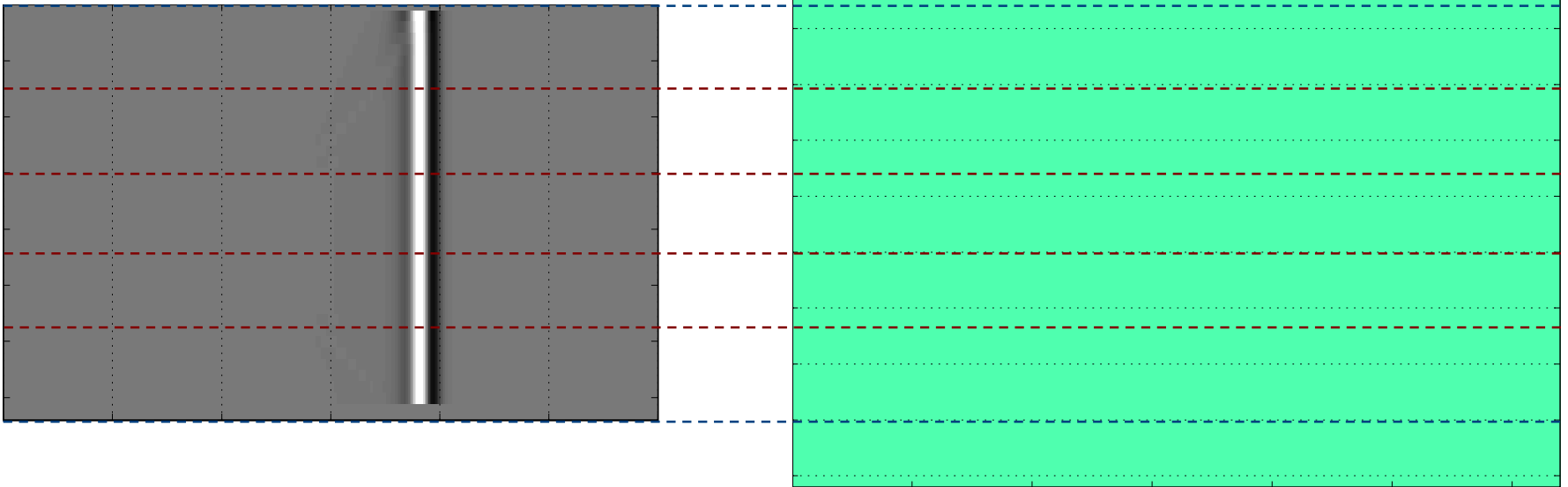


Cross-well data (modelled)

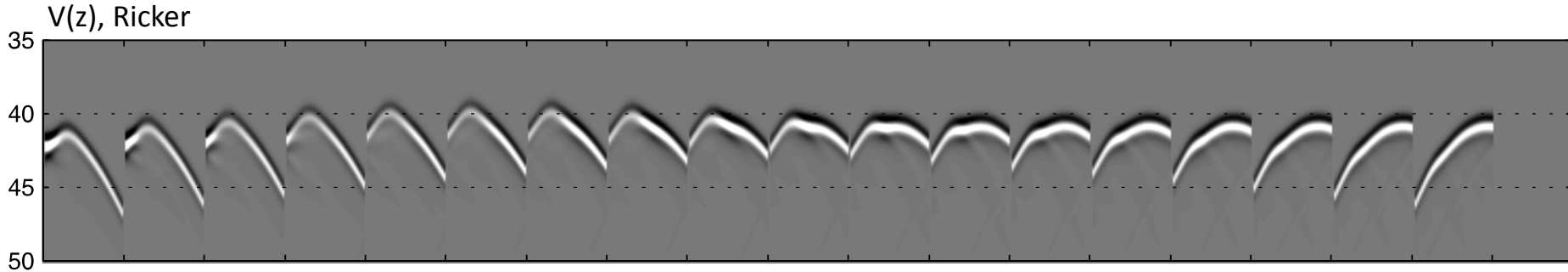
Homogeneous, Ricker



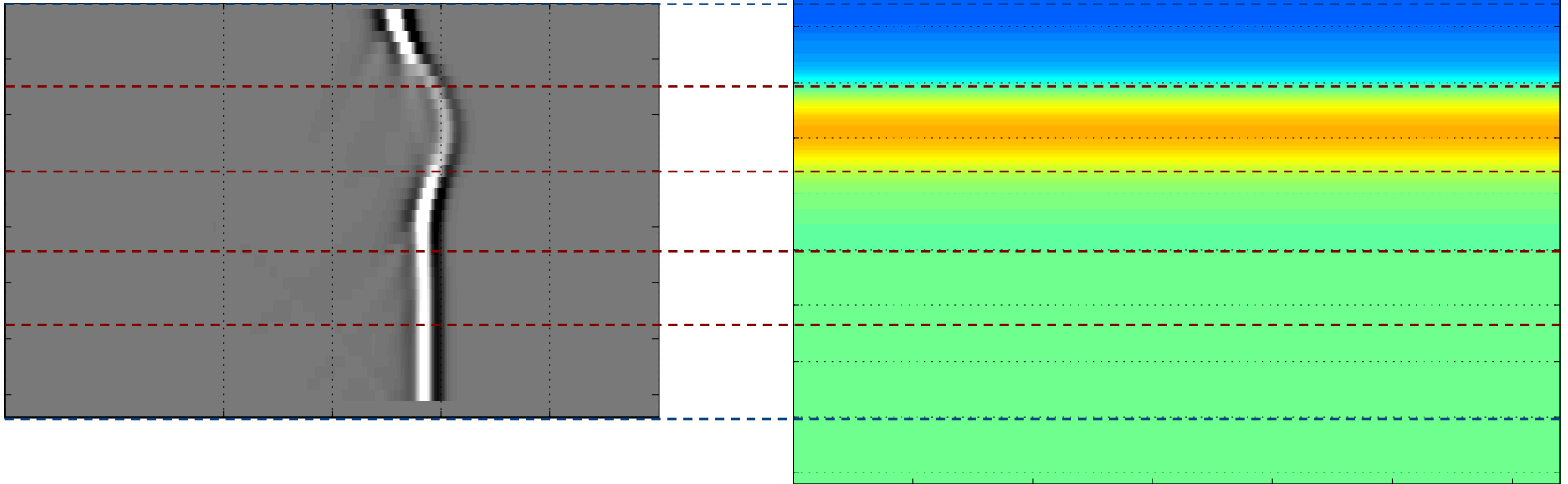
Same level section: Homogeneous, Ricker



Cross-well data (modelled)

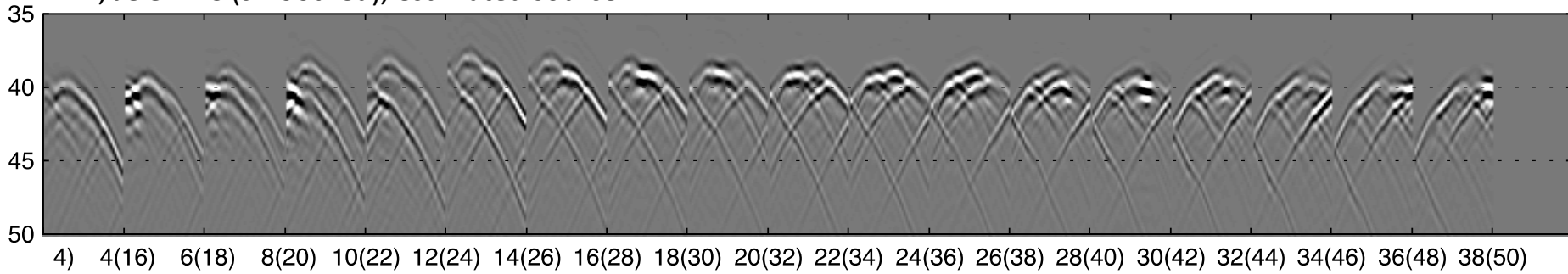


Same level section: V(z), Ricker

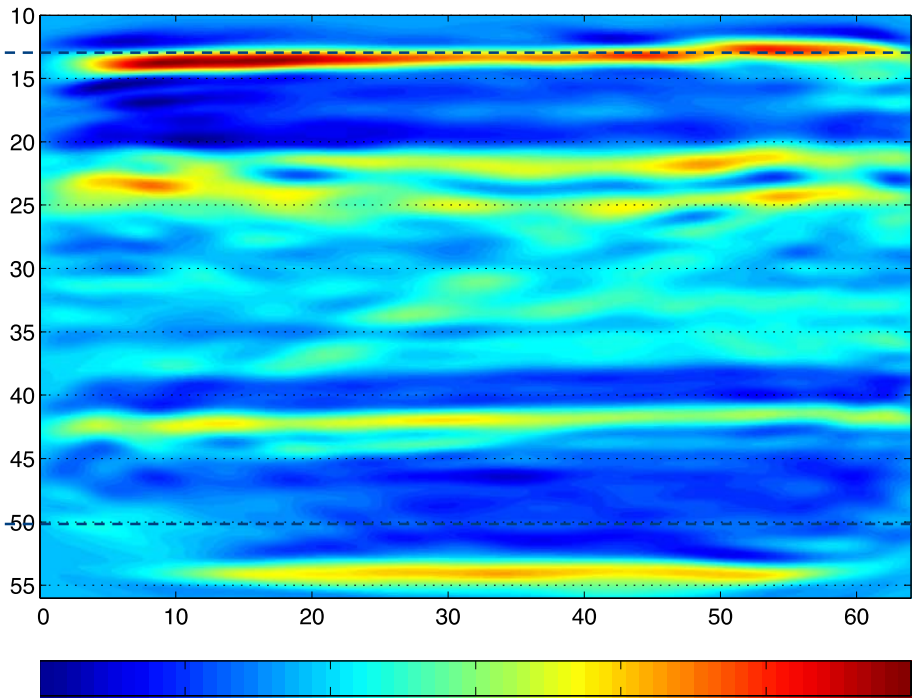
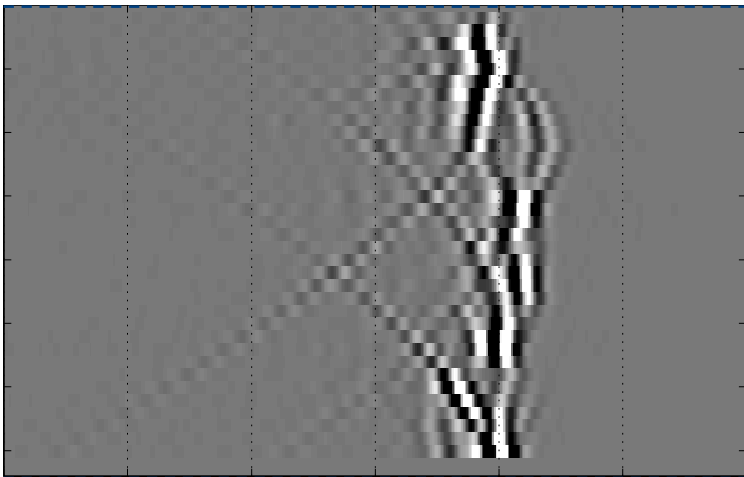


Cross-well data (modelled)

FWI, JOGMEC (smoothed), estimated source

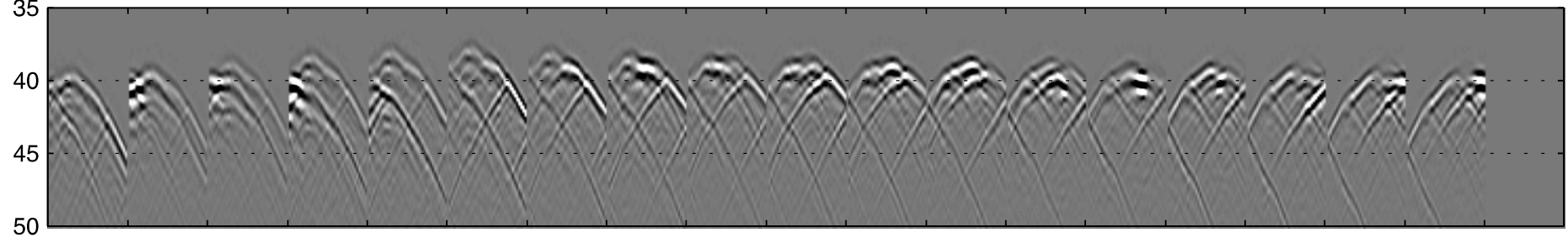


Same level section: FWI, JOGMEC, estimated source

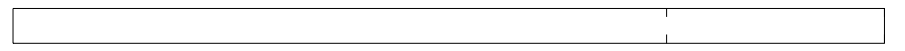
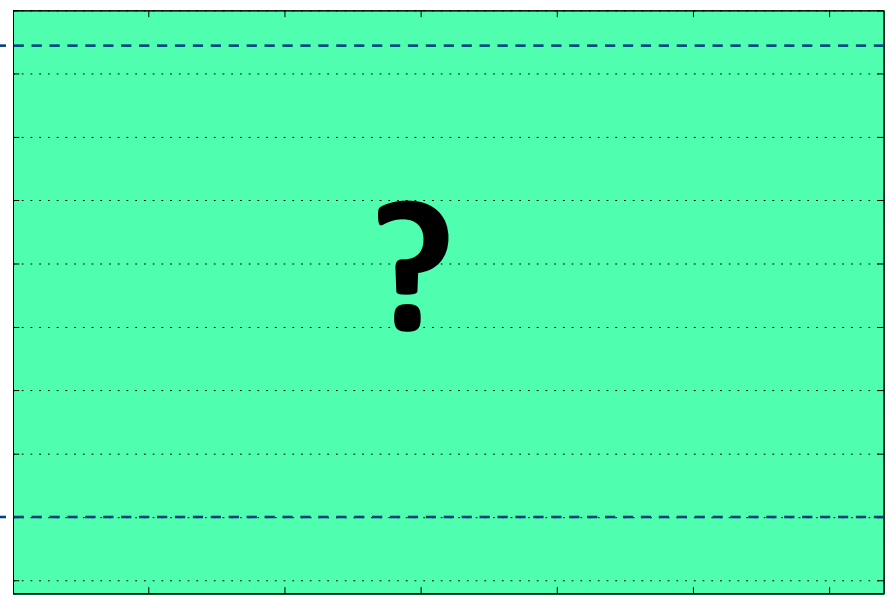
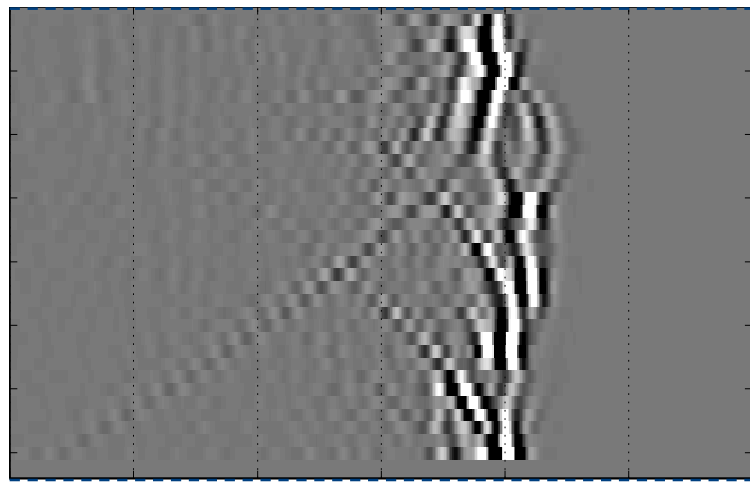


Cross-well data (real)

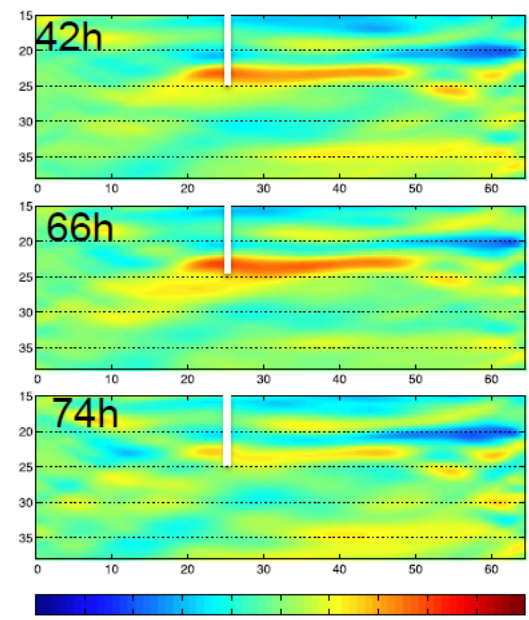
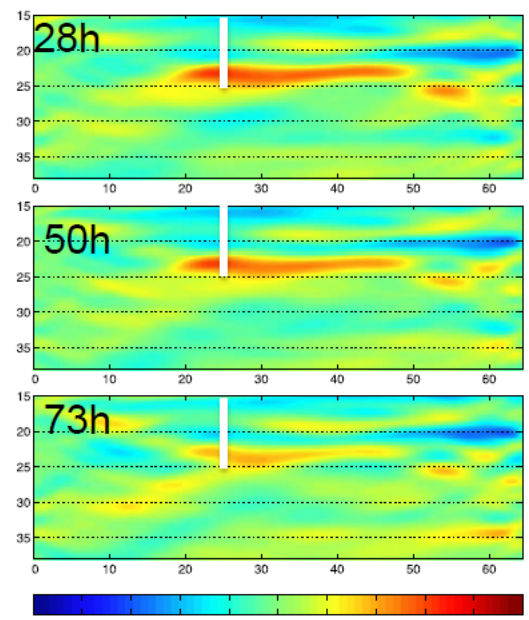
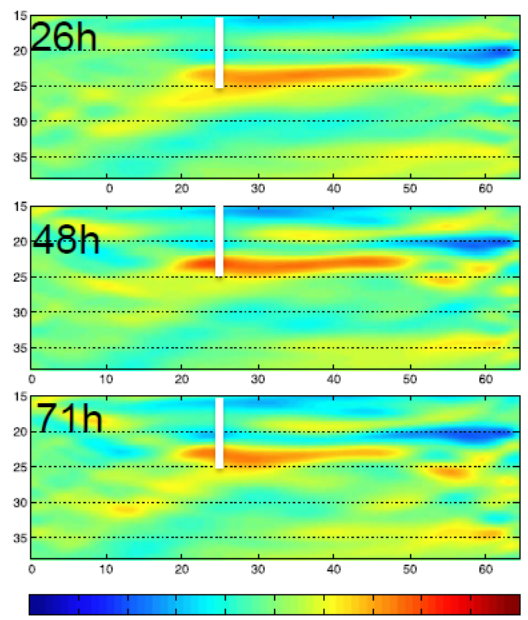
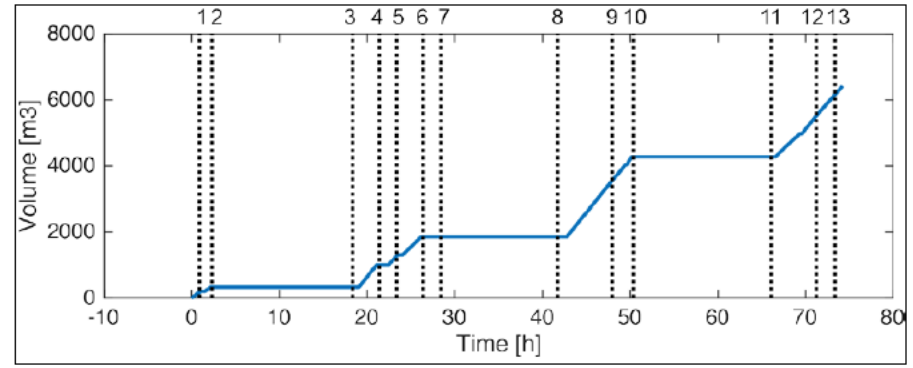
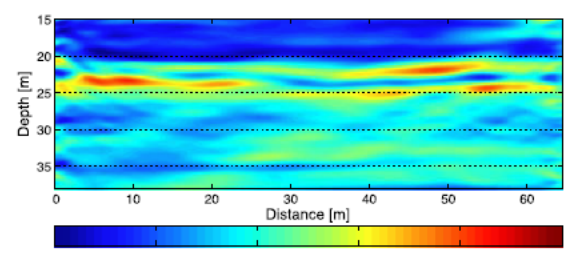
Baseline (00h.1kHz) : damping / muting / low-pass (1500Hz) / amplitude correction (manual)



Same level section: Baseline (00h.1kHz)



4D FWI (real data)



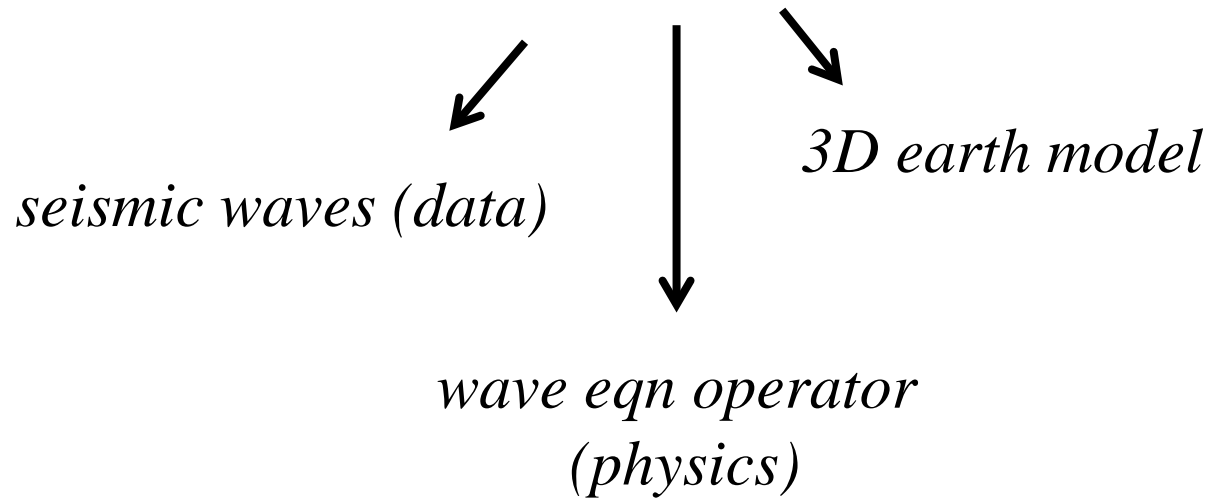
Full waveform inversion

- **Practical issues:**

- *Very promising, but still a lot of R&D work to do... (us!)*
- *Works well on 2D synthetics; 3D and real data much harder*
- *Very computationally intensive (HPC)*
- *Many approximations being made (acoustic, time-damping...)*
- *Convergence and uniqueness issues*
- *FWI result not guaranteed to give best image...*

Why do we need HPC?

Forward modeling/simulating waves

$$\mathbf{d} = \mathbf{F} \mathbf{m}$$


Forward modeling (simulation)

$$d = Fm$$



3D earth model(x:y:z:p) =
model($10^{3-4}:10^{3-4}:10^{3-4}:10^{0-1}$) = 10^{10-14} bytes
Memory = 10 GB - 100 TB

Forward modeling (simulation)

$$d = F m$$



3D seismic data(s:r:t:c) =
data(10⁴⁻⁶:10⁴:10⁴:10⁰⁻¹) = 10¹³⁻¹⁶ bytes
Storage = 10 TB - 10 PB

Forward modeling (simulation)

$$d = \mathbf{F} m$$



Wave operator(*fc:x:y:z:t:c*) =

weq($10^{1-2}:10^{3-4}:10^{3-4}:10^{3-4}:10^{4-5}:10^{0-1}$) = 10^{14-20} flops

computation = 100 Tflops - 100 Exaflops

3D Imaging (RTM)

$$R = \mathbf{F}^* d$$



for all sources = 1:10⁴⁻⁶ {
fwd model the source wavefield;
reverse-time propagate the receiver wavefield;*
cross-correlate both wavefields;
add contribution to update the image }

Cost ~ 10⁴⁻⁶ x modeling = 10¹⁸⁻²⁶ flops = 10⁰⁻⁸ Exaflops!

So we have to be clever about:

- * approximating/accelerating wave operators (Clusters, GPUs...)*
- * pre-compute/store/load wavefields etc. (memory, storage, i/o)*

Full waveform inversion

$$m = \mathbf{F}^{-1}d$$

$$\min \mathbf{E}^2 = w_d^2 (d - \mathbf{F}m)^2 + w_m^2 (m - m_0)^2 + \dots$$

for all iterations = 1:10¹⁻³ {

apply the adjoint imaging operation \mathbf{F}^*d ;

estimate/update the earth model m ;

forward model the simulated wavefield $\mathbf{F}m$;

compare to the recorded data d ;

check convergence criteria \mathbf{E}^2 }

Cost $\sim 10^{1-3} \times$ imaging = 10^{19-29} flops = 10^{1-11} Exaflops!

So we have to be extremely clever (ie. we don't know how to do this yet!):

* approximating/accelerating wave operators (Clusters, GPUs...)

* pre-compute/store/load wavefields etc. (memory, storage, i/o)

Seismic HPC Conclusions

- **Seismic modelling, imaging, and inversion maxes out on ALL key computational aspects:**
- Memory: *10 GB - 100 TB*
- Storage: *10 TB - 10 PB*
- FLOPs: *100 Tflops - 10¹¹ Exaflops*
- I/O: *network bandwidth limits (eg. 120 Gb/s Infiniband)*

>> We need HPC!



Thank you

