

# Unmeasurable aspects of seismic data and implications for QI.

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Patrick Connolly Associates Ltd.



*geophysics for integration*

# Deep Blue



Defeated World Chess Champion  
Garry Kasparov in 1997



Moravec's paradox

Computers and humans  
have complementary skills

‘Advanced Chess’; humans + machines

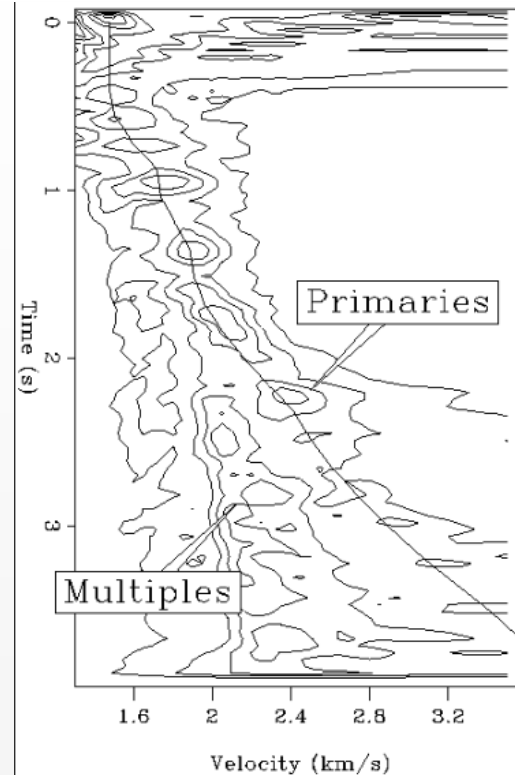
2005 Tournament:

- ‘Dream-teams’: Grandmasters + Computer scientists
- Won by Steven Cramton and Zackary Stephen; amateur players using laptops
- *‘We had really good methodology for when to use the computer and when to use our human judgement’*
- *‘A clever process beat superior knowledge and superior technology’* - Garry Kasparov

# Seismic

World leaders in optimising human + machine combination?

Perhaps we are!



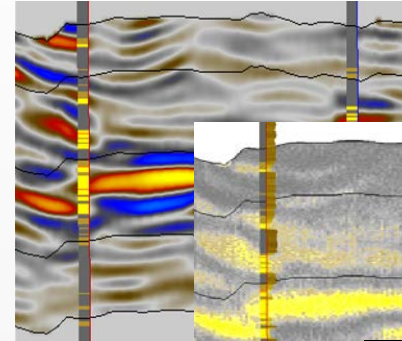
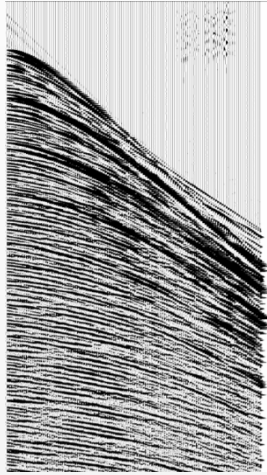
## Seismic Data Processing & Interpretation

- Machines; applying decon, NMO and migration operators
- Humans; picking velocities, selecting optimal parameters, interpretation

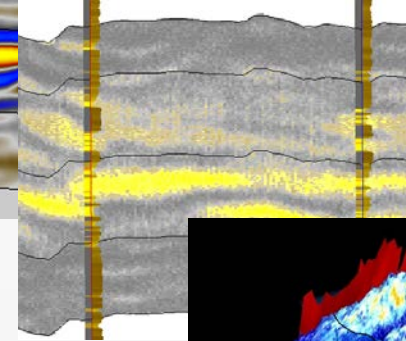
QI?

# Why can't computers do everything?

field data



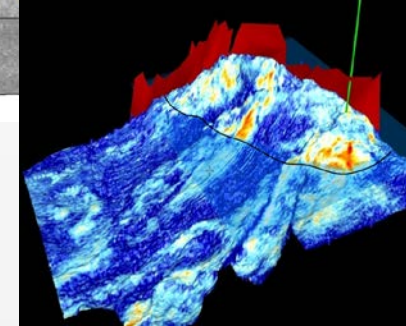
fully processed



inverted



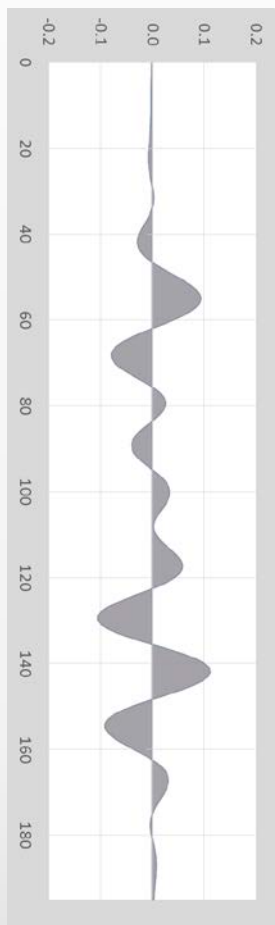
prospect



Because some aspects of seismic can't be measured

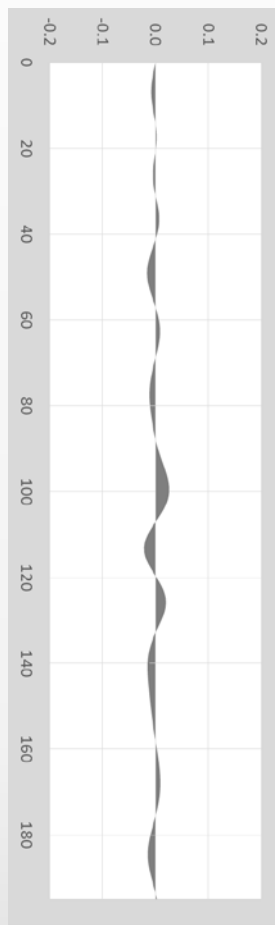
# Signal-to-noise

Incoherent noise



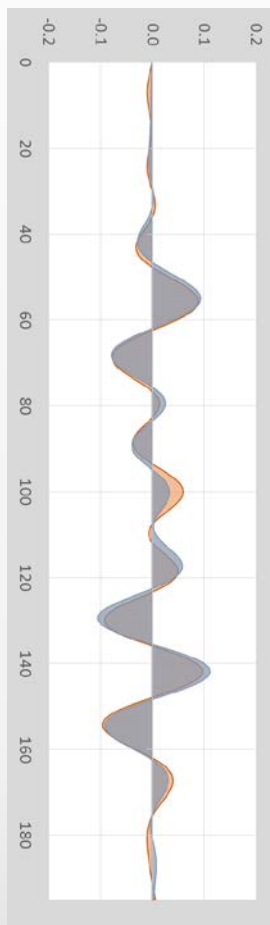
signal

+



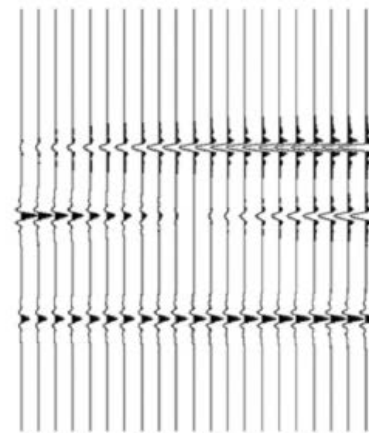
noise

=

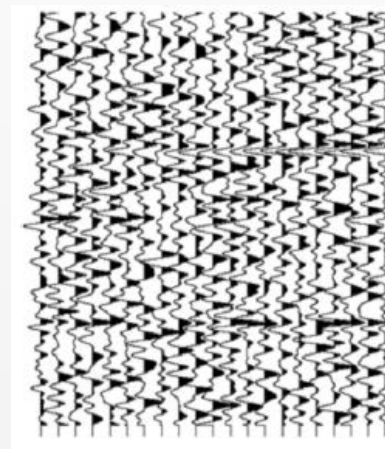


signal + noise  
5:1

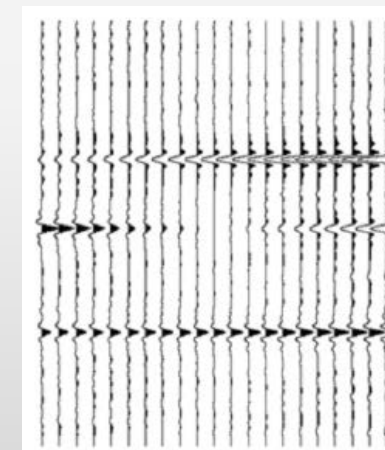
signal



signal + noise



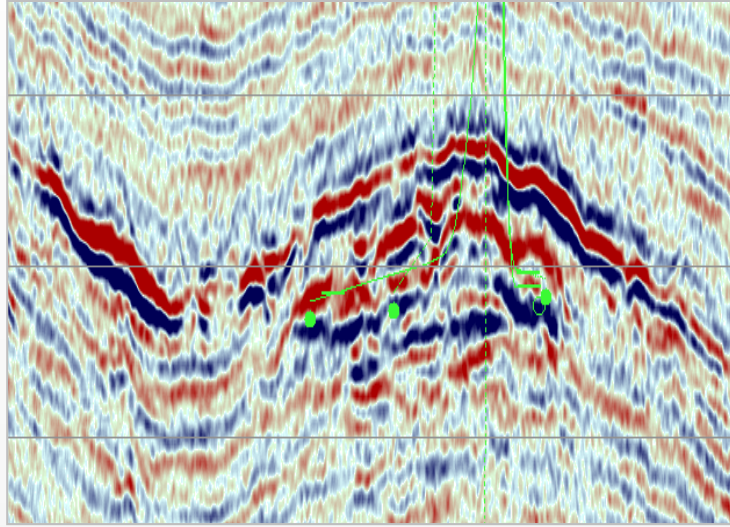
after noise reduction



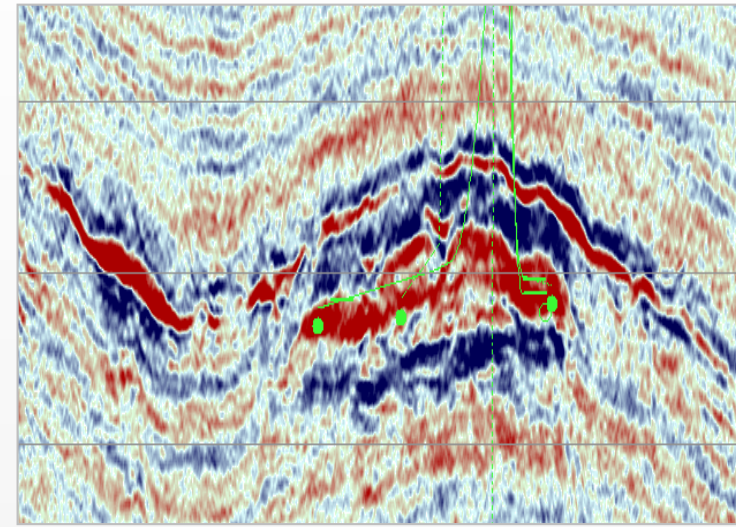
# Coloured Inversion

Fluid and lithology identification using high-resolution 3D seismic data

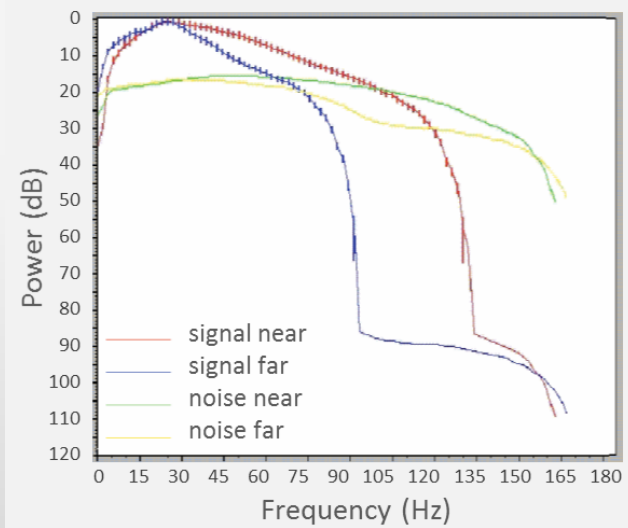
P. Connolly, S. Wilkins, T. Allen, G. Schurter & N. Rose-Innes,  
Proceedings of the 6th Petroleum Geology Conference, 2005



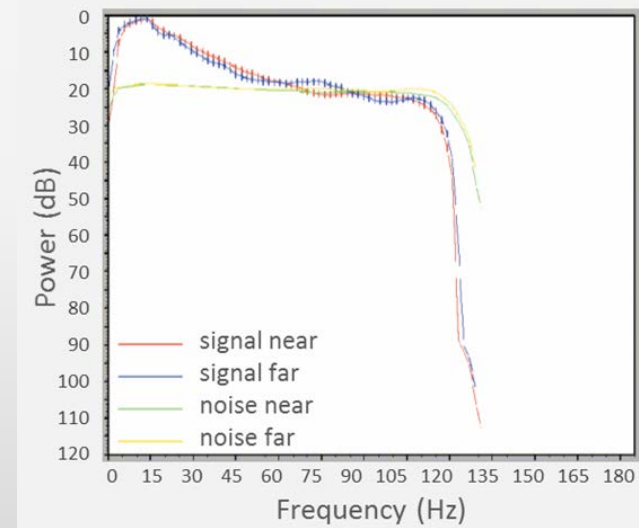
reflectivity



band-limited impedance  
(colour inversion)

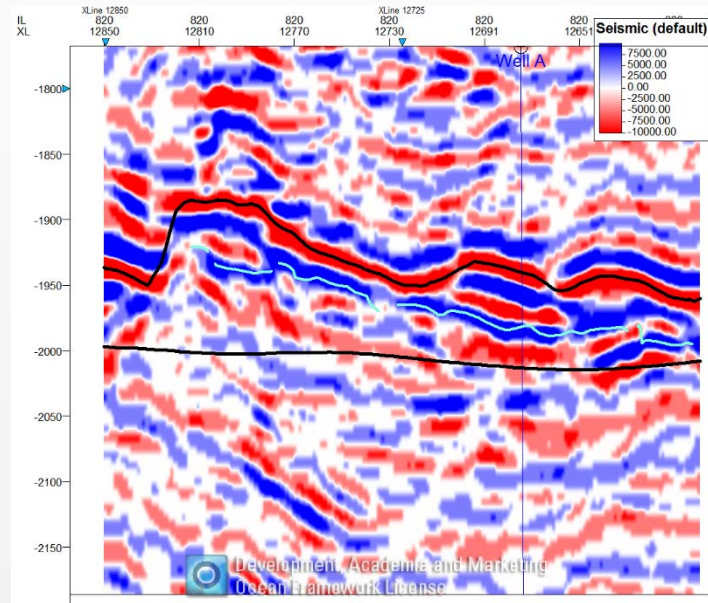


Signal changes  
but noise  
doesn't (?)

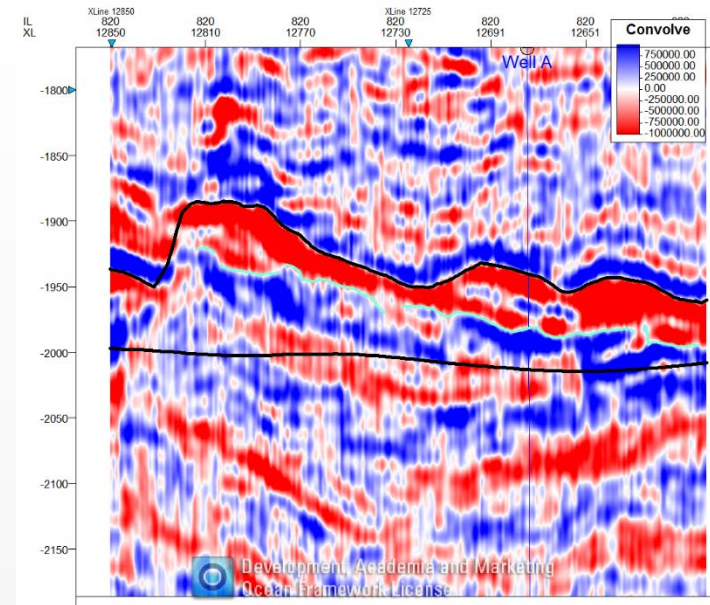


# Trial & error

Input reflectivity data

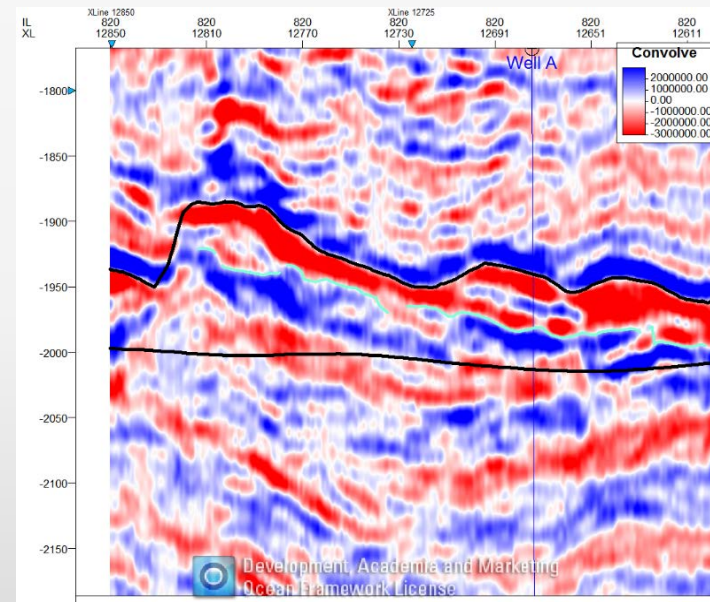


3-4-43-63Hz

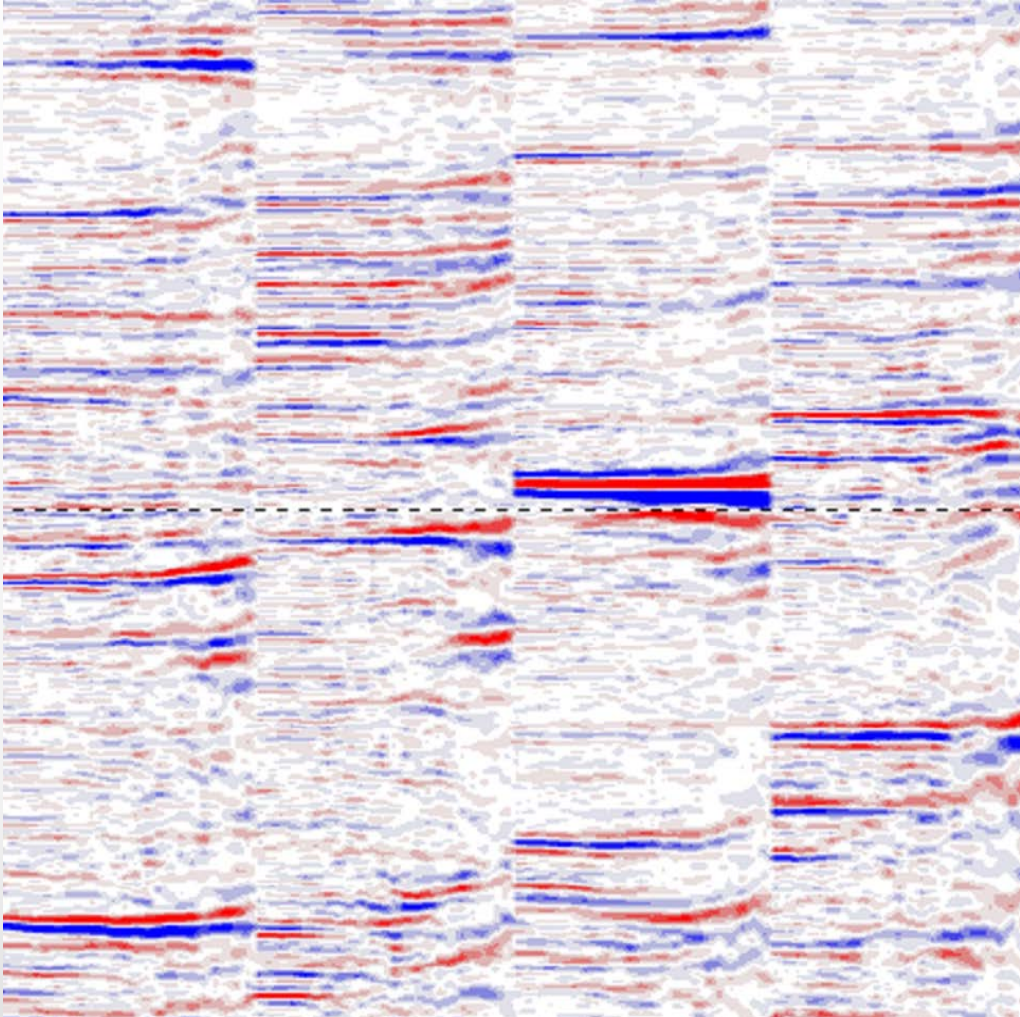


Output CI

8-9-43-63Hz



# Gradient measurement errors

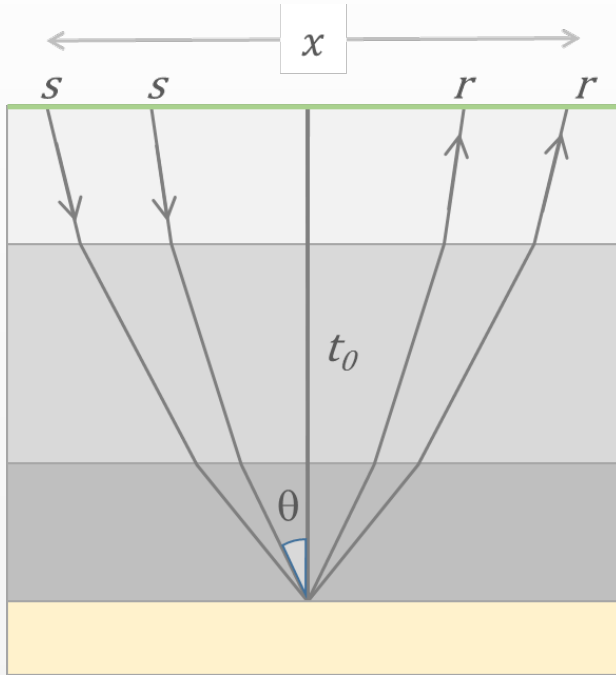


- Flat gathers
- Offset scaling
- Offset spectral balancing
- Offset to angle relationship
- Truncation bias
- Anisotropy
- Moveout correction artefacts:
  - NMO stretch
  - Offset tuning
- Random noise
- Coherent noise:
  - Multiples
  - Mode conversions
  - Residual noise



# Angle estimation errors

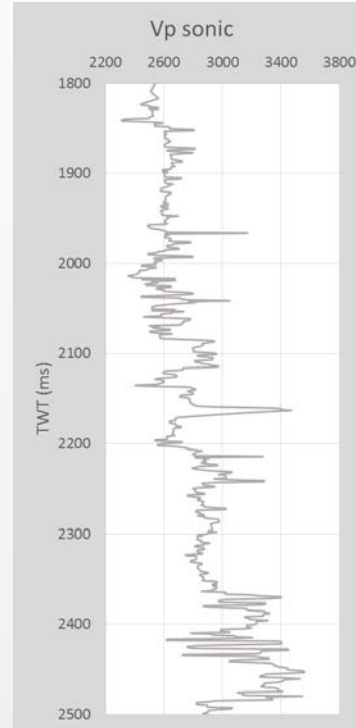
$$R(\theta) \approx A + B \sin^2 \theta$$



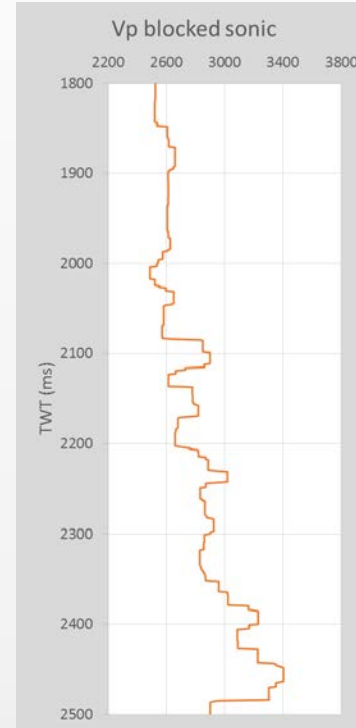
$$\sin^2 \theta = \frac{x^2 V_i^2}{V_r^2 (V_r^2 t_0^2 + x^2)}$$

where  $x$  = offset  
 $V_i$  = interval velocity  
 $V_r$  = RMS velocity  
 $t_0$  = zero offset TWT

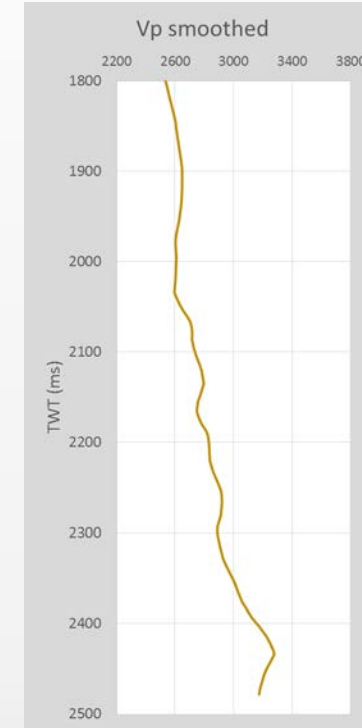
West-of-Shetland  
Tertiary sonic



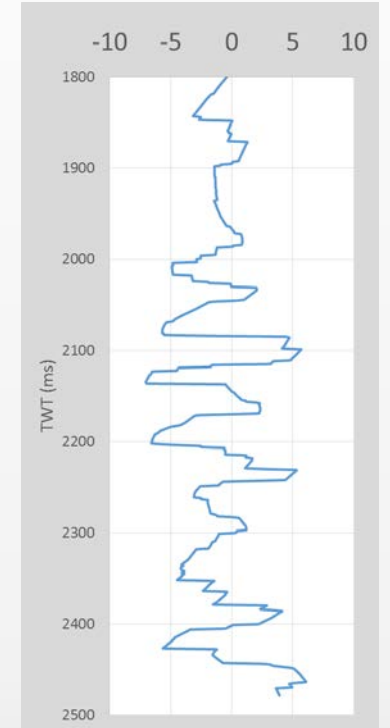
Blocked (22ms):  
~seismic resolution



Smoothed (100ms):  
~velocity resolution

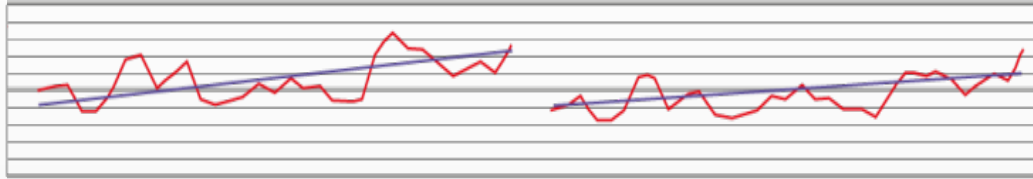


Difference:  
% velocity error

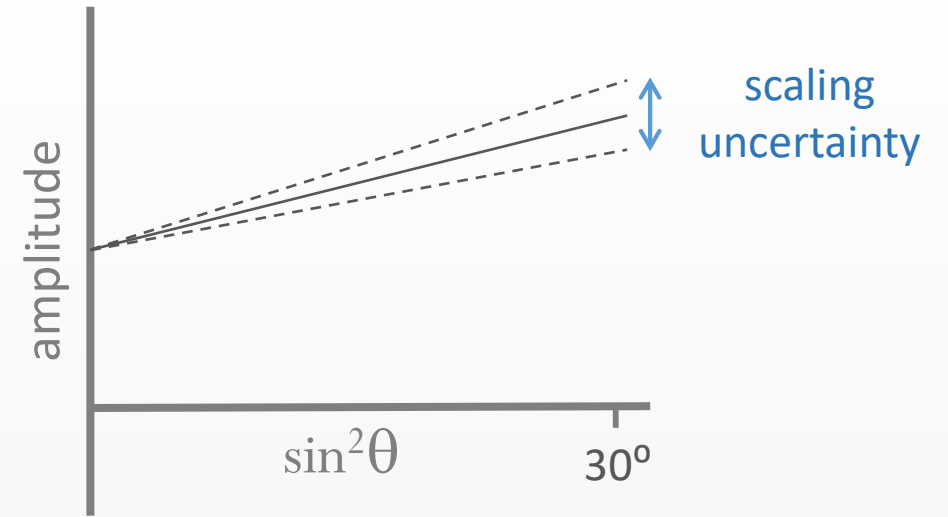
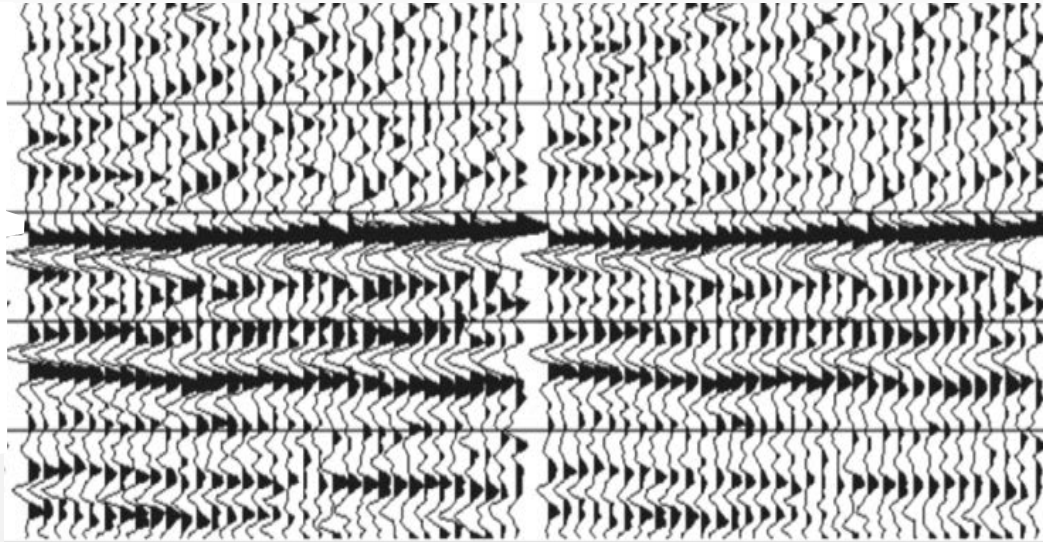


- 5% errors unavoidable, 10% errors likely
- Much larger errors quite possible

# Offset scaling errors



~10%  
difference



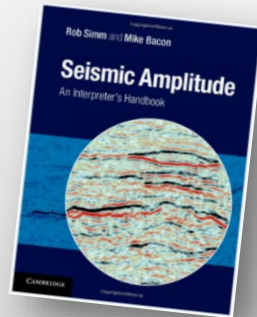
$$B_m = SB + 4(S - 1)A$$

$B$  = true gradient

$S$  = scaling factor (1 = correct scaling)

$B_m$  = measured gradient

Seismic Amplitude. An Interpreter's Handbook,  
2014, R. Simm and M. Bacon,



- 10% errors unavoidable
- Much larger errors quite likely

# Anisotropy – the Rüger equation

$$R(\theta) \approx A + B \sin^2 \theta + C \sin^2 \theta \tan^2 \theta$$

$$A = \frac{1}{2} \left( \frac{\Delta V_P}{V_P} + \frac{\Delta \rho}{\rho} \right)$$

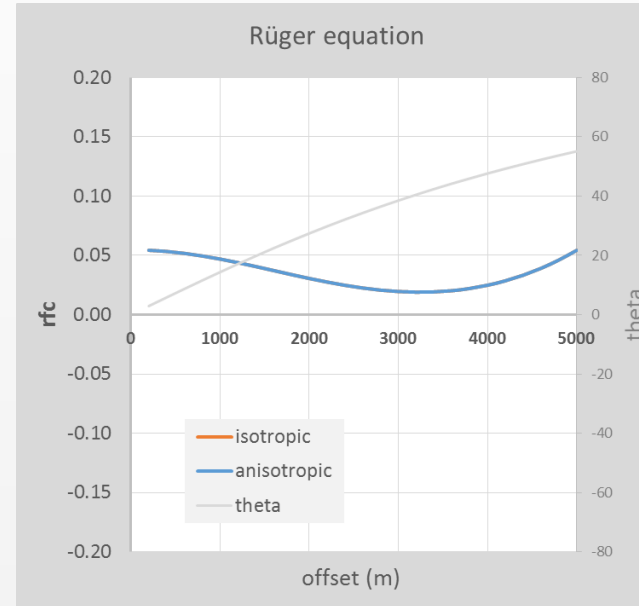
$$B = \frac{\Delta V_P}{2V_P} - 2k \left( \frac{\Delta \mu}{\mu} \right) + \frac{\Delta \delta}{2}$$

$$C = \frac{\Delta V_P}{2V_P} + \frac{\Delta \varepsilon}{2}$$

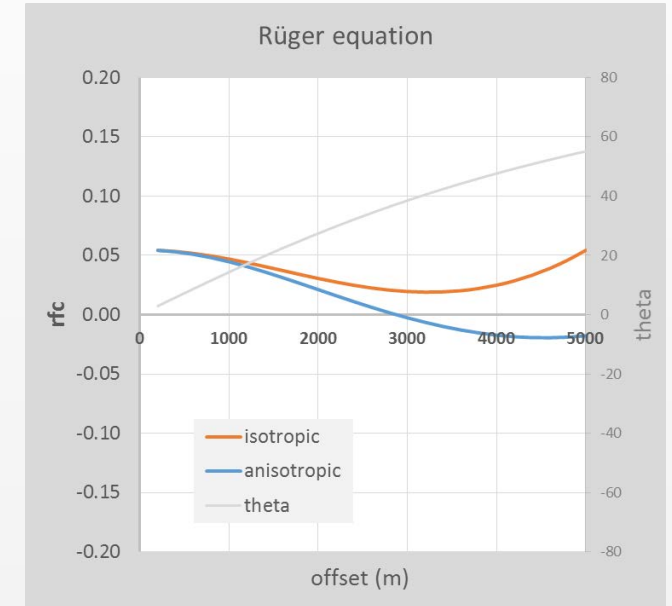
$$V_{NMO} = V_P(0^\circ)[1 + \delta]$$

$$V_P(90^\circ) = V_P(0^\circ)[1 + \varepsilon]$$

Isotropic top brine sand



$\Delta \delta = -0.07$  and  $\Delta \varepsilon = -0.07$



	$V_p$	$V_s$	$\rho$
layer 1	2743	1273	2.38
layer 2	3113	1579	2.34

Offshore Angola well

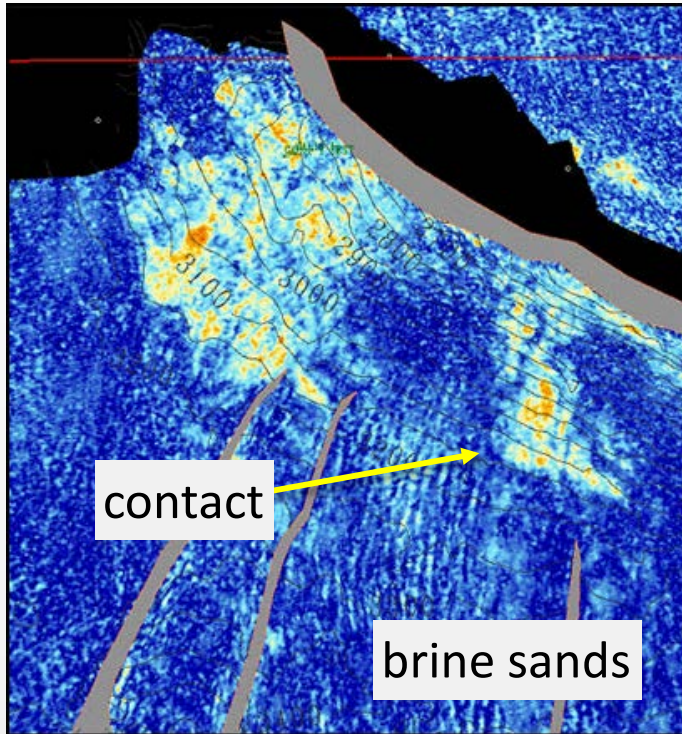
- layer 1 average shale values
- layer 2 average brine-sand values.

Typical sand/shale contrast for  $\delta$  and  $\varepsilon = 0.07^*$

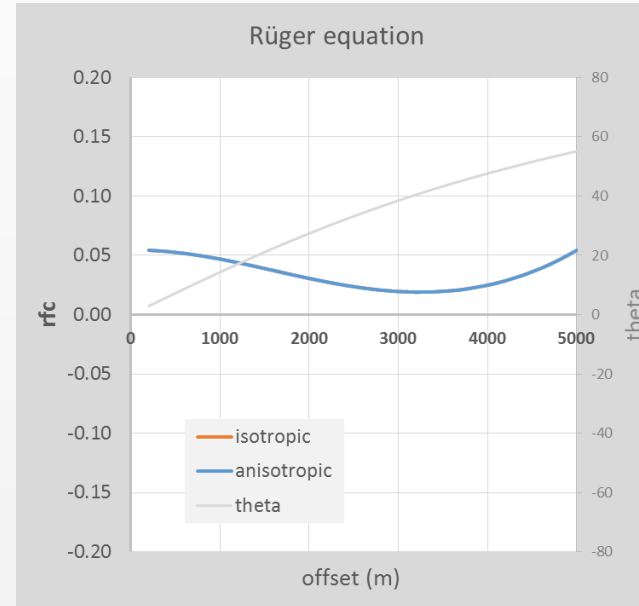
\*Weak anisotropy, 1986, Leon Thomsen, Geophysics

# Anisotropy – the Rüger equation

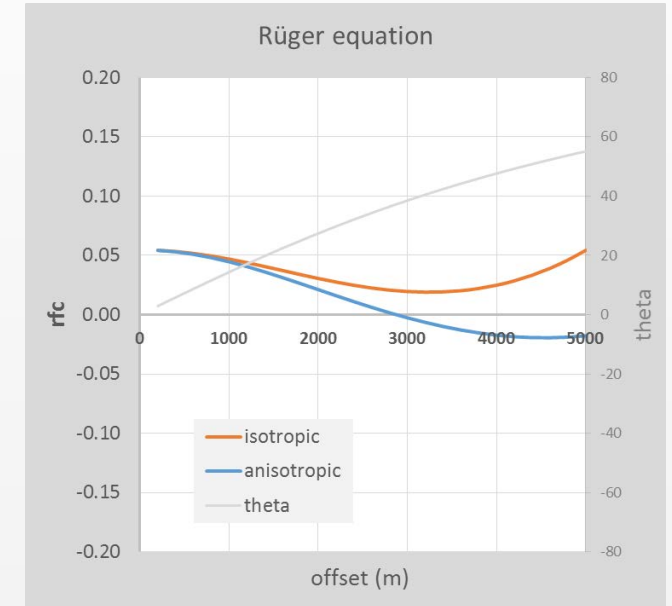
## Amplitude map – far offsets



## Isotropic top brine sand



$$\Delta\delta = -0.07 \text{ and } \Delta\varepsilon = -0.07$$



	$V_p$	$V_s$	$\rho$
layer 1	2743	1273	2.38
layer 2	3113	1579	2.34

## Offshore Angola well

- layer 1 average shale values
- layer 2 average brine-sand values.

Typical sand/shale contrast for  $\delta$  and  $\varepsilon = 0.07^*$

\*Weak anisotropy, 1986, Leon Thomsen, Geophysics

# Theory: elastic property reflectivity

$P$  = elastic property (or product)

$$R_P = \frac{\Delta P}{2P} = \text{elastic property reflectivity}$$

$$R_P = c_1 A + c_2 B + c_3 C$$

where

$A$  = intercept

$B$  = gradient

$C$  = curvature

$R_P$	$A$	$B$	$C$
$\lambda\rho$	3	1	0
$K\rho$	2.5	0.5	0
$\mu\rho$	0.5	-0.5	0
SI	0.5	-0.5	0
$E\rho$	1.17	-0.83	0
$V_P/V_S$	0.5	0.5	0
K	1.5	0.5	1
$\mu$	0	-1	1

# Theory: elastic property reflectivity

$P$  = elastic property (or product)

$$R_P = \frac{\Delta P}{2P} = \text{elastic property reflectivity}$$

$$R_P = c_1 A + c_2 B + c_3 C$$

where

$A$  = intercept

$B$  = gradient

$C$  = curvature

$$R_S(\chi) = A \cos(\chi) + B \sin(\chi)$$

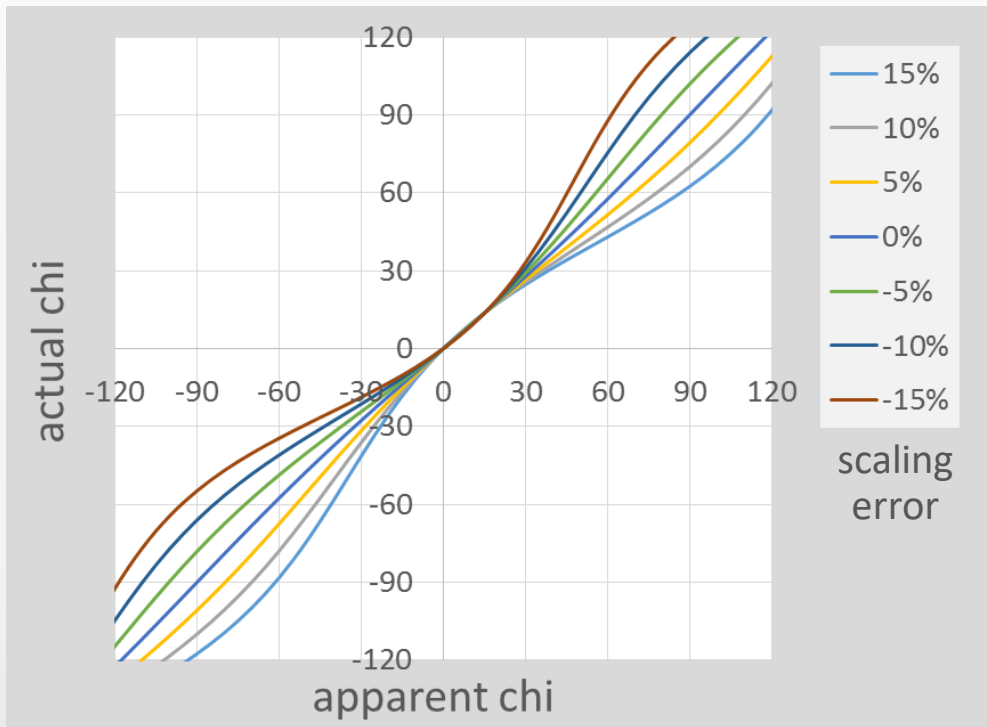
$R_P$	$A$	$B$	$C$	$\chi$
$\lambda\rho$	3	1	0	18.4°
$K\rho$	2.5	0.5	0	11.3°
$\mu\rho$	0.5	-0.5	0	-45°
SI	0.5	-0.5	0	-45°
$E\rho$	1.17	-0.83	0	-35.5°
$V_P/V_S$	0.5	0.5	0	45°
K	1.5	0.5	1	~12.3°
$\mu$	0	-1	1	~51.3°

$$k = 0.25$$

$$k = 0.25 \text{ \& Gardner } (C = 0.8A)$$

# Theory: elastic property reflectivity

Gradient measurements are in error;  
actual  $\chi$  not equal to apparent  $\chi$



Chi error curves

angle error = 10%, variable scaling error

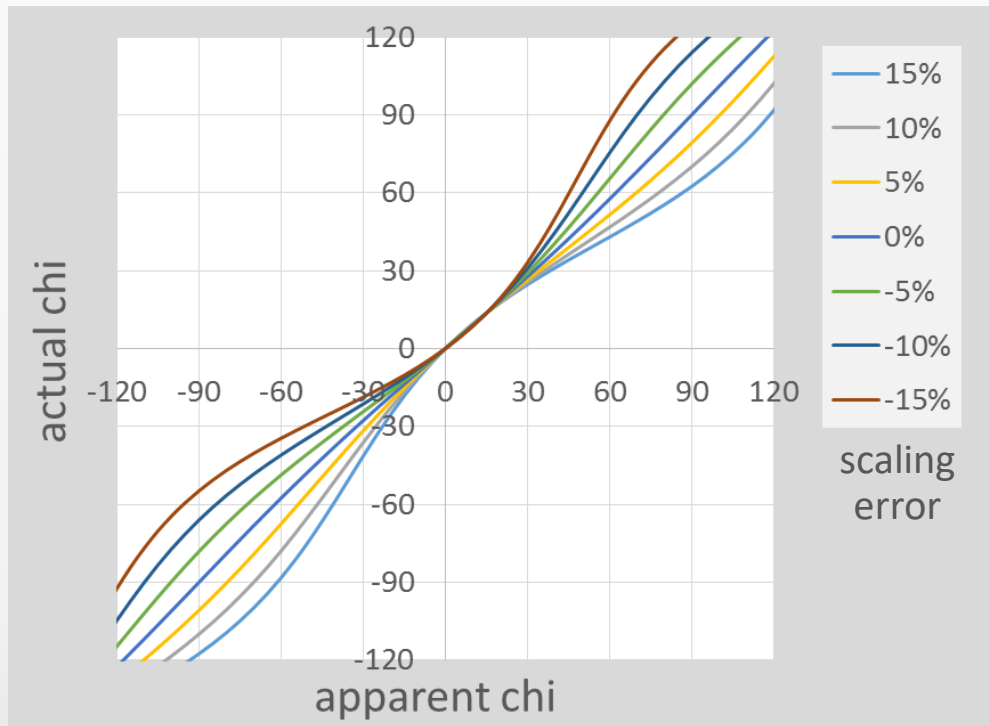
$R_P$	$A$	$B$	$C$	$\chi$
$\lambda\rho$	3	1	0	18.4°
$K\rho$	2.5	0.5	0	11.3°
$\mu\rho$	0.5	-0.5	0	-45°
SI	0.5	-0.5	0	-45°
$E\rho$	1.17	-0.83	0	-35.5°
$V_P/V_S$	0.5	0.5	0	45°
K	1.5	0.5	1	~12.3°
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$k = 0.25$

$k = 0.25$  & Gardner ( $C = 0.8A$ )

# Theory: elastic property reflectivity

Gradient measurements are in error;  
actual  $\chi$  not equal to apparent  $\chi$



Chi error curves

angle error = 10%, variable scaling error

“No battle plan survives contact  
with the enemy”

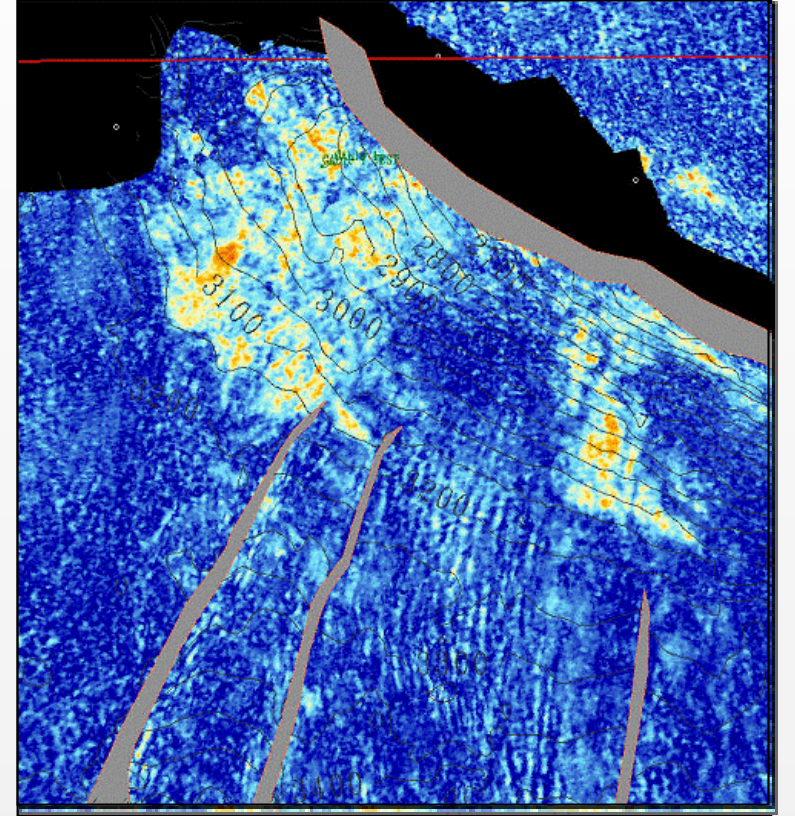
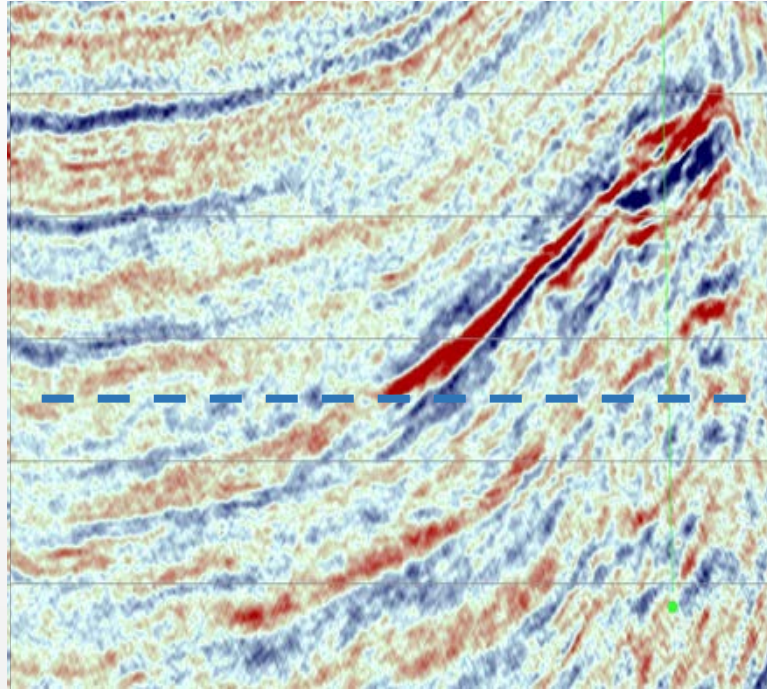
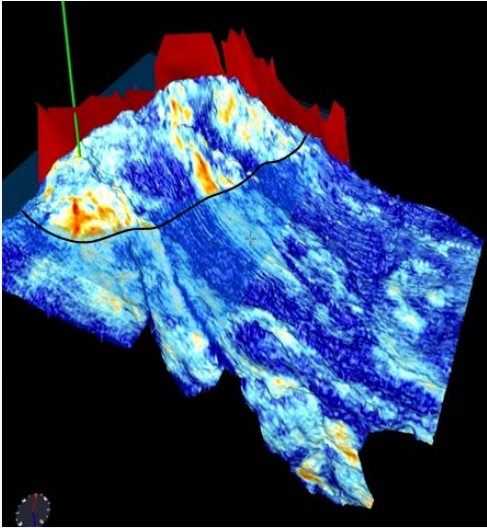
- Field Marshall Helmuth von Moltke



“No theory survives contact  
with the data”

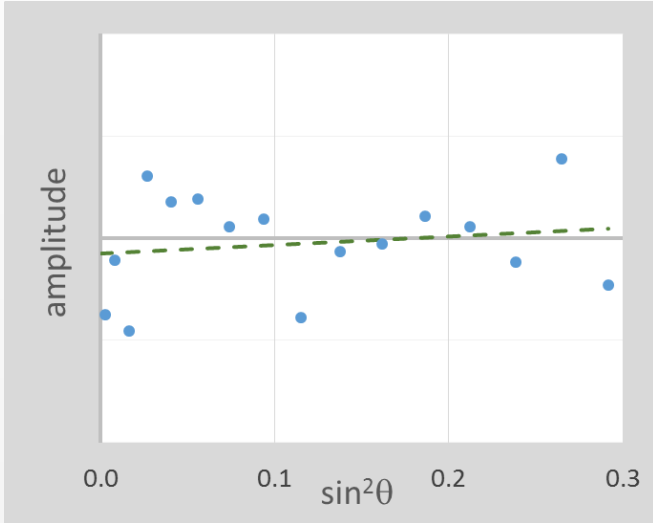


# Chi scan

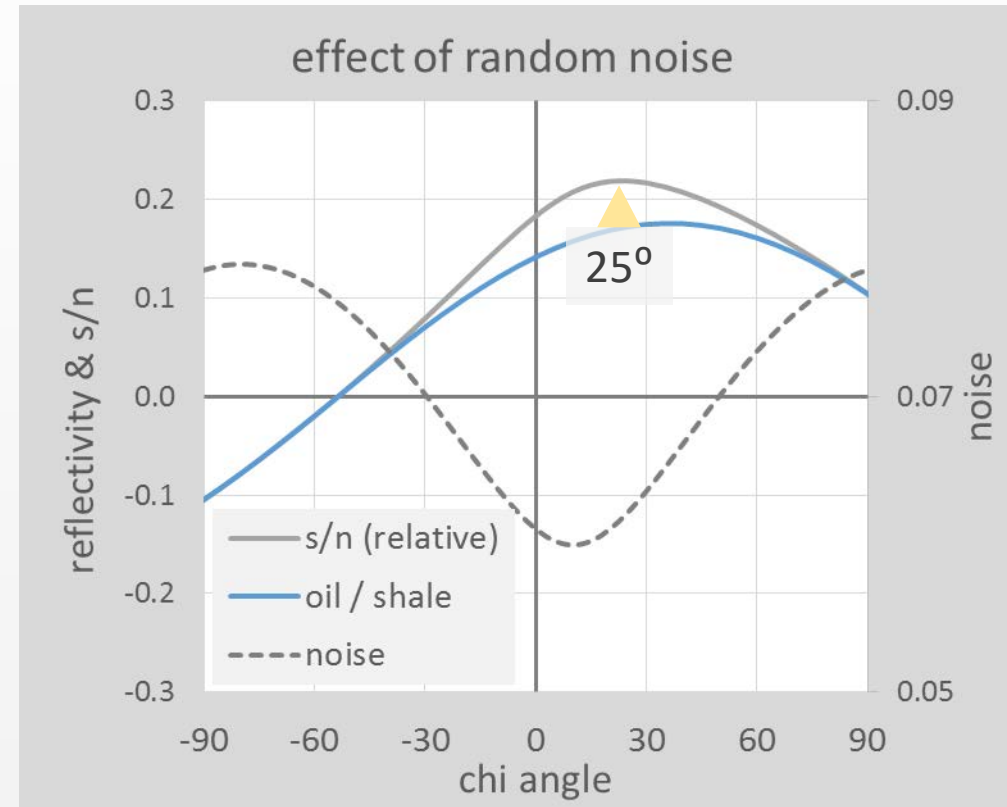
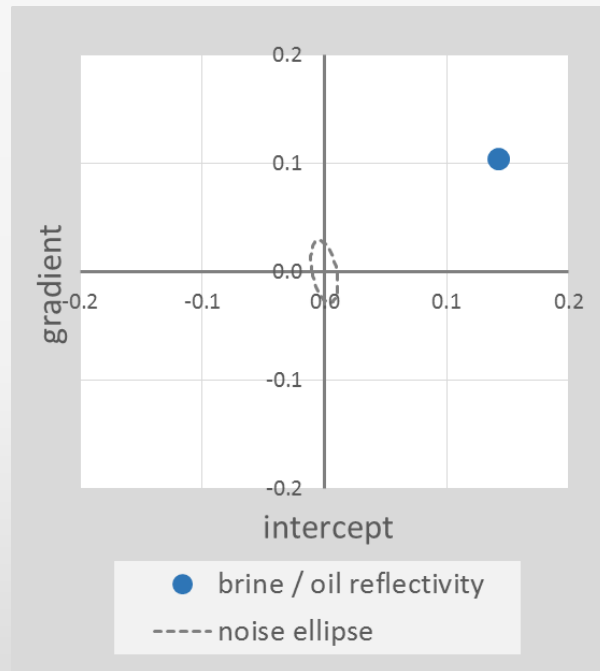
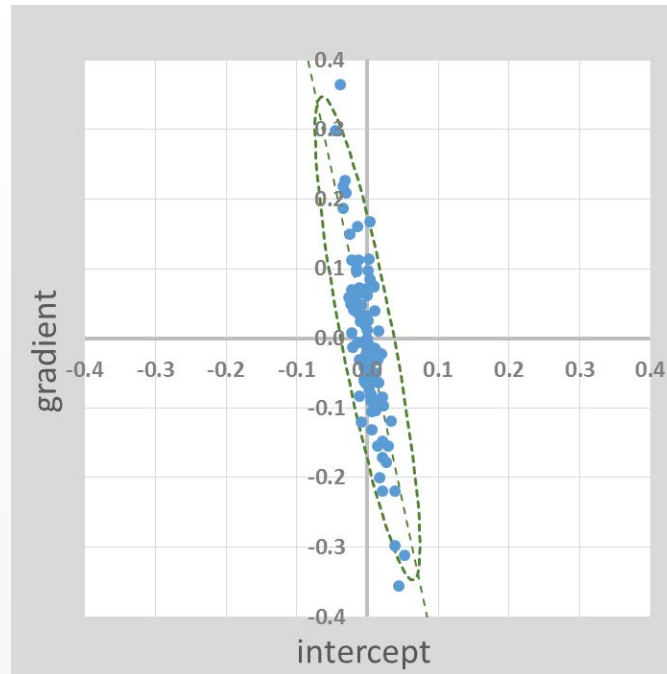


*(simulated scan)*

# Noise



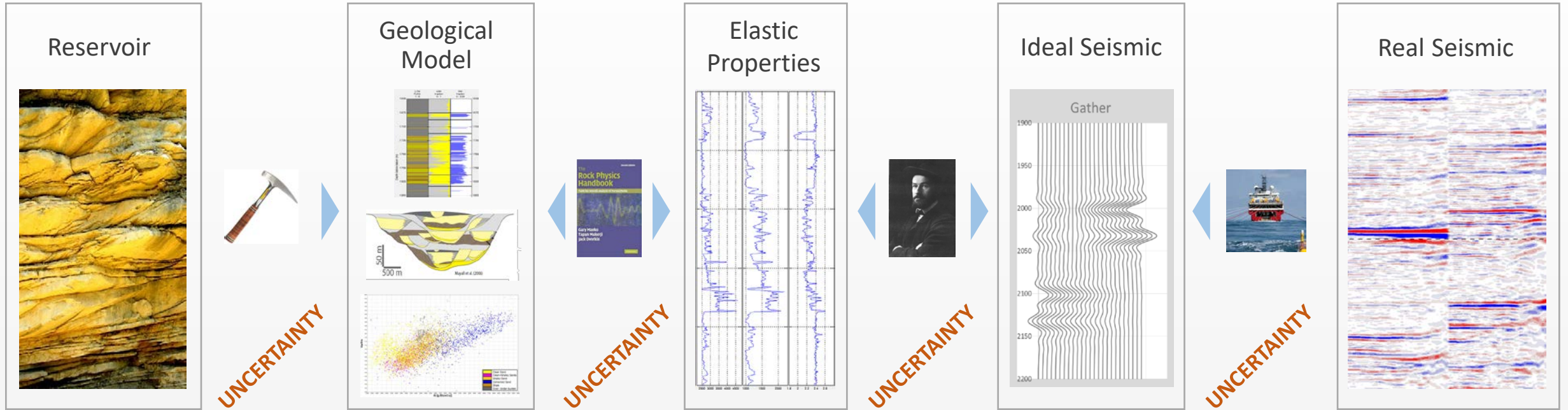
Random noise



The maximum signal-to-noise is shifted towards the stack chi value

But we can't calculate the shift!

# Inversion to reservoir properties

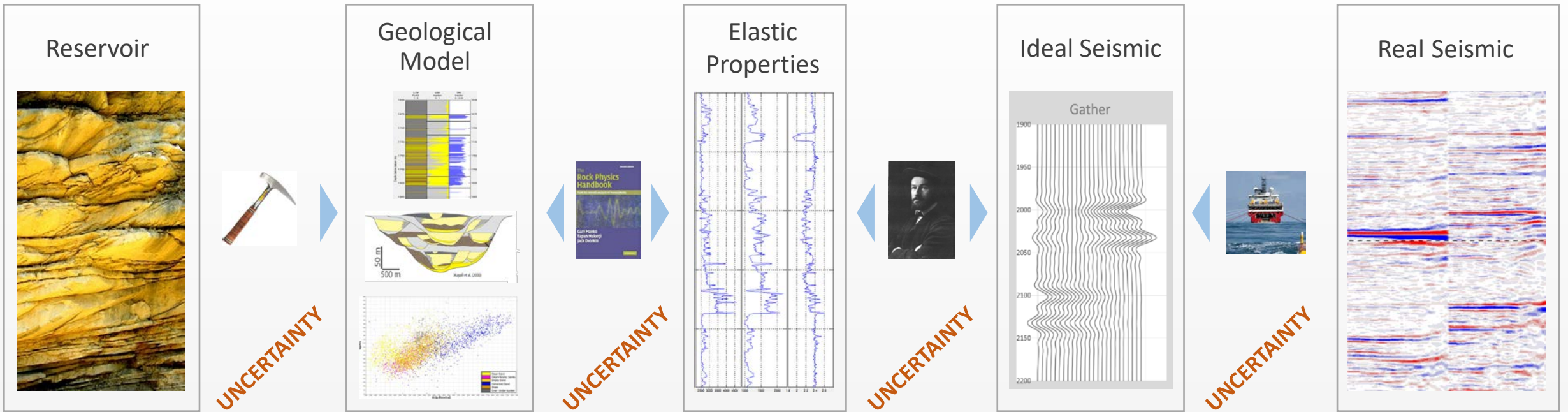


inversion to reservoir properties

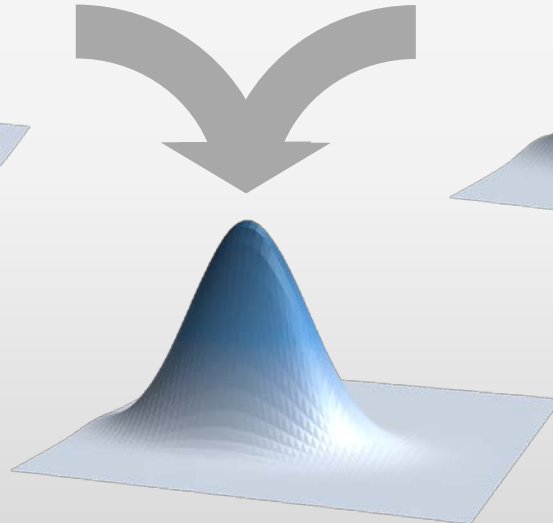
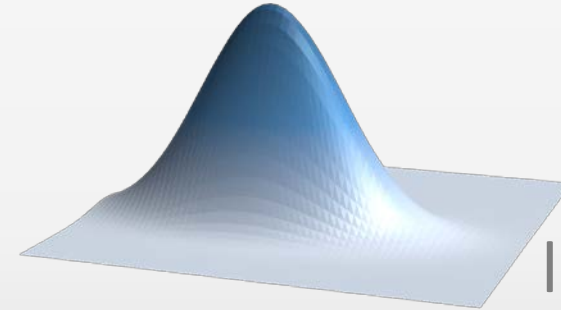
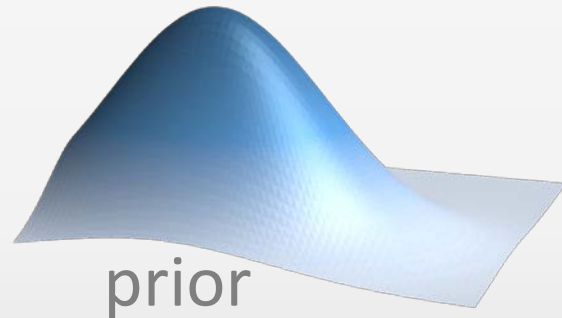
rock physics models

geological models

# Probabilistic inversion



Bayes

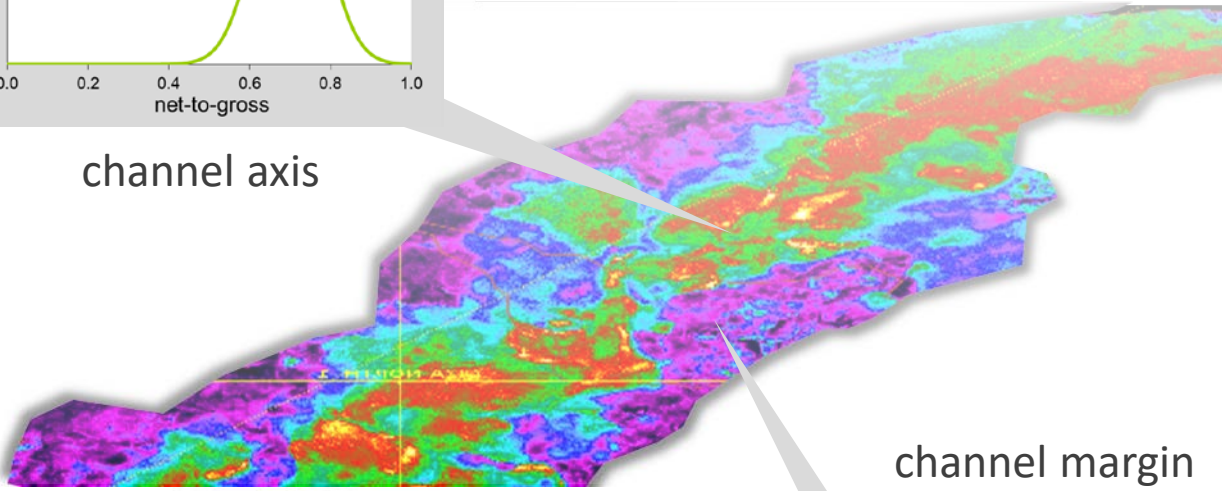


But, we can't measure uncertainties!

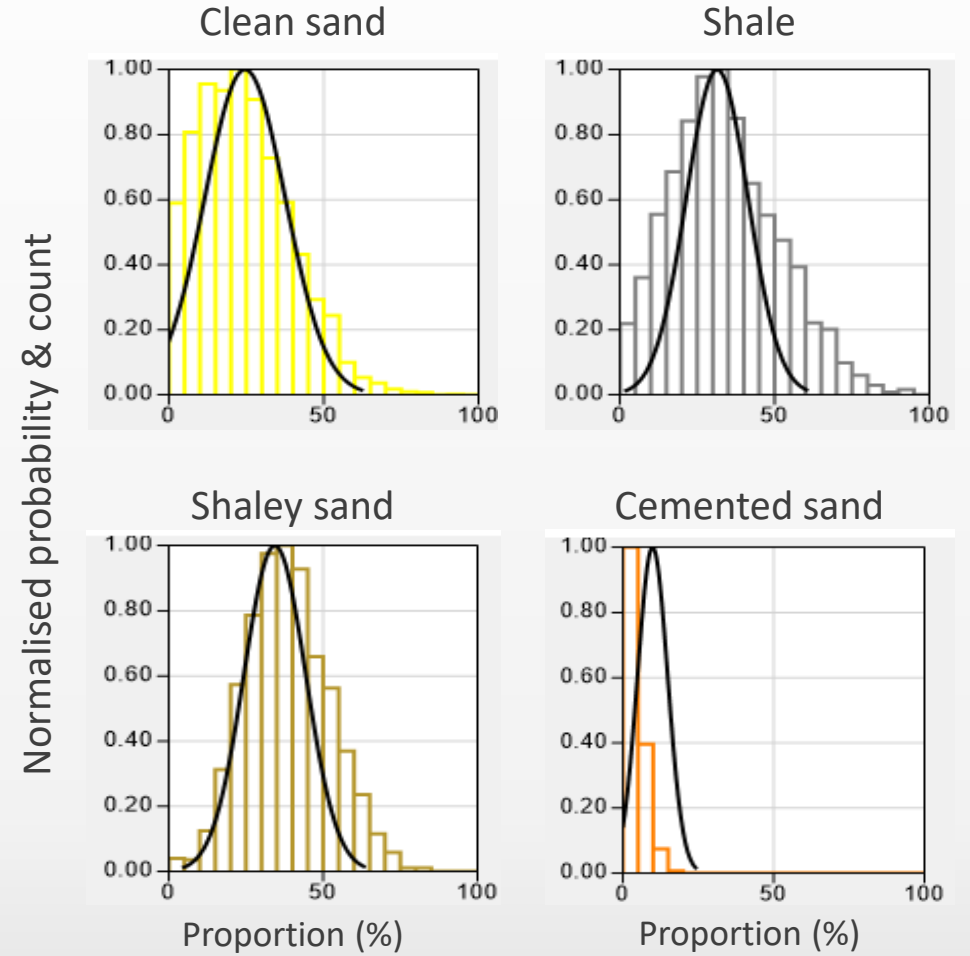
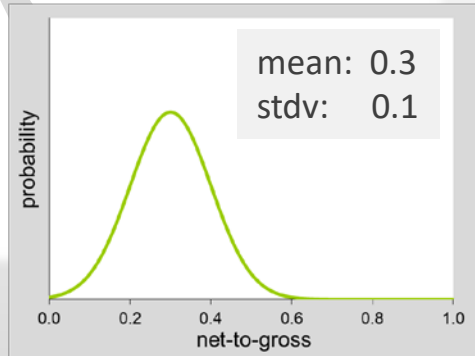
# Geological model



channel axis



channel margin

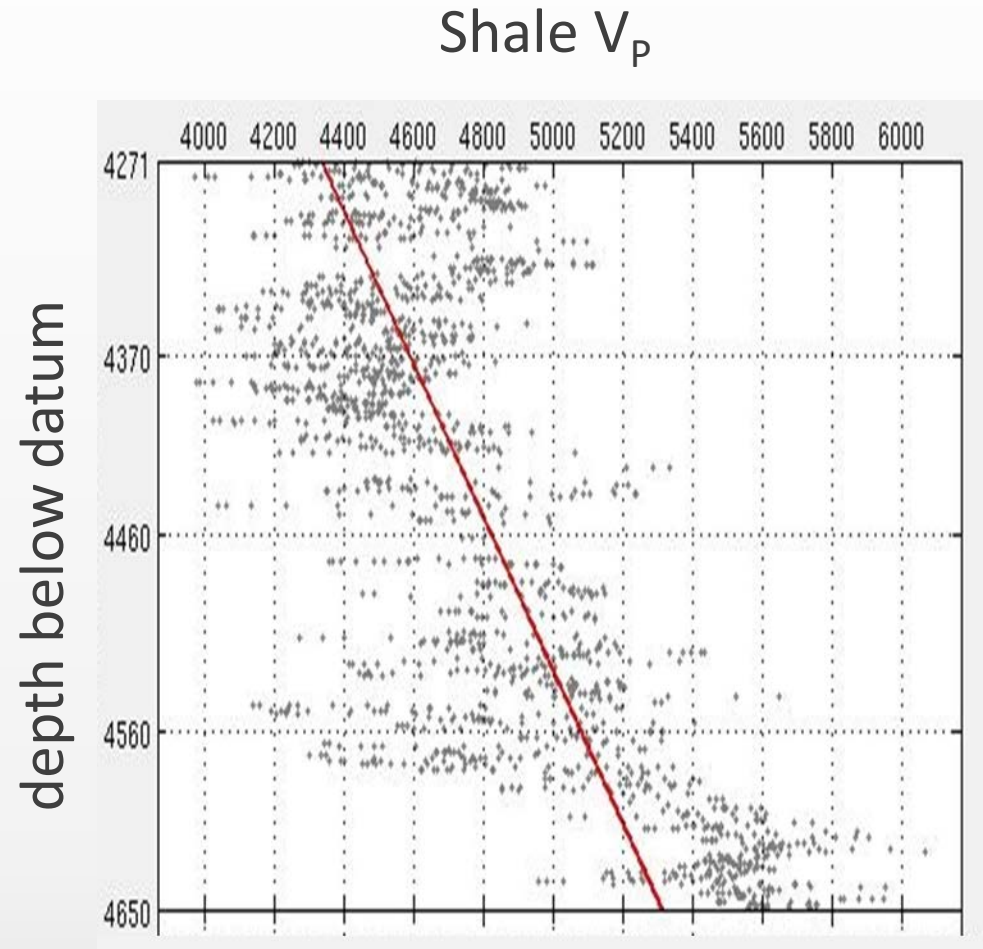


lithofacies proportions

# Rock physics uncertainties

- Uncertainty measurements depend on the model.
- If the model is wrong the uncertainties will be too large, or too small.

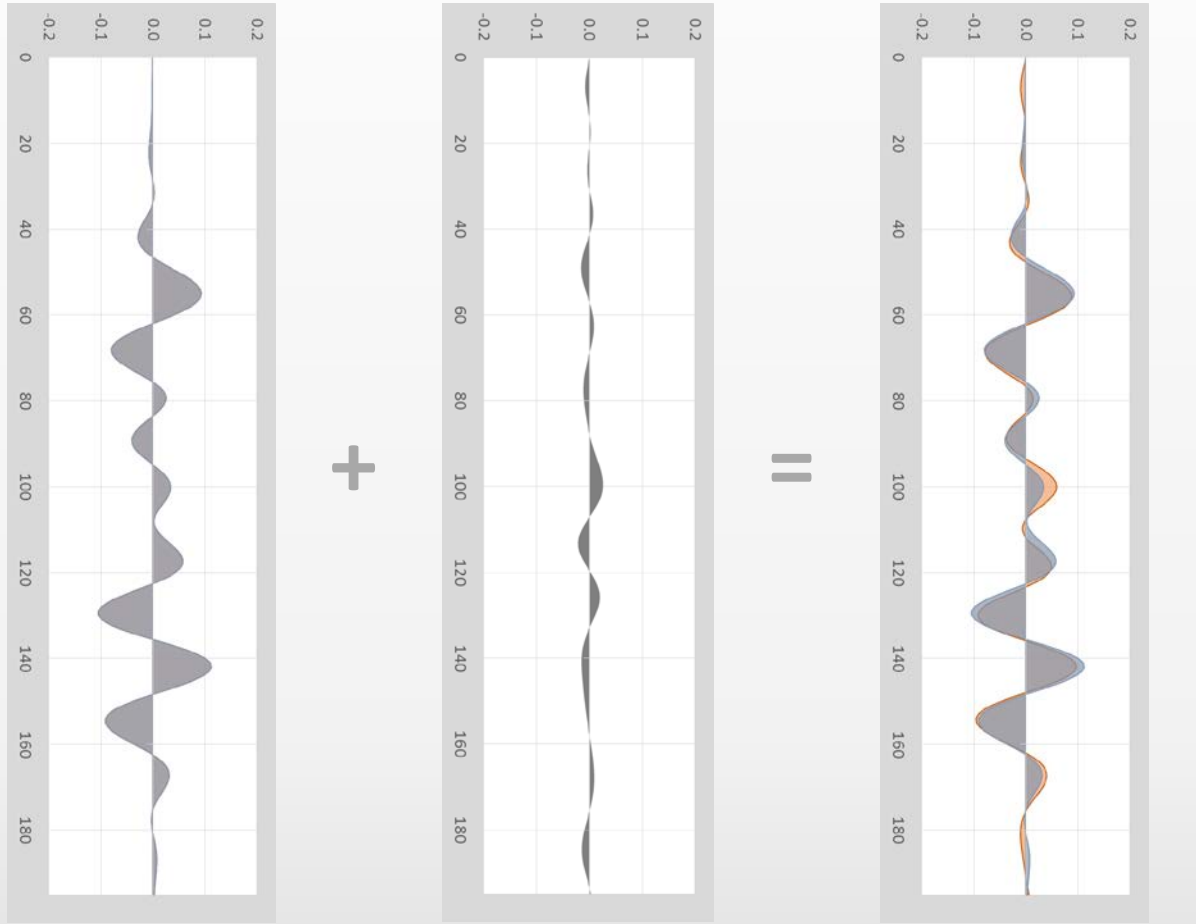
Uncertainty quantification  
is always subjective



What model would you fit to this?

# Seismic uncertainty

Incoherent noise



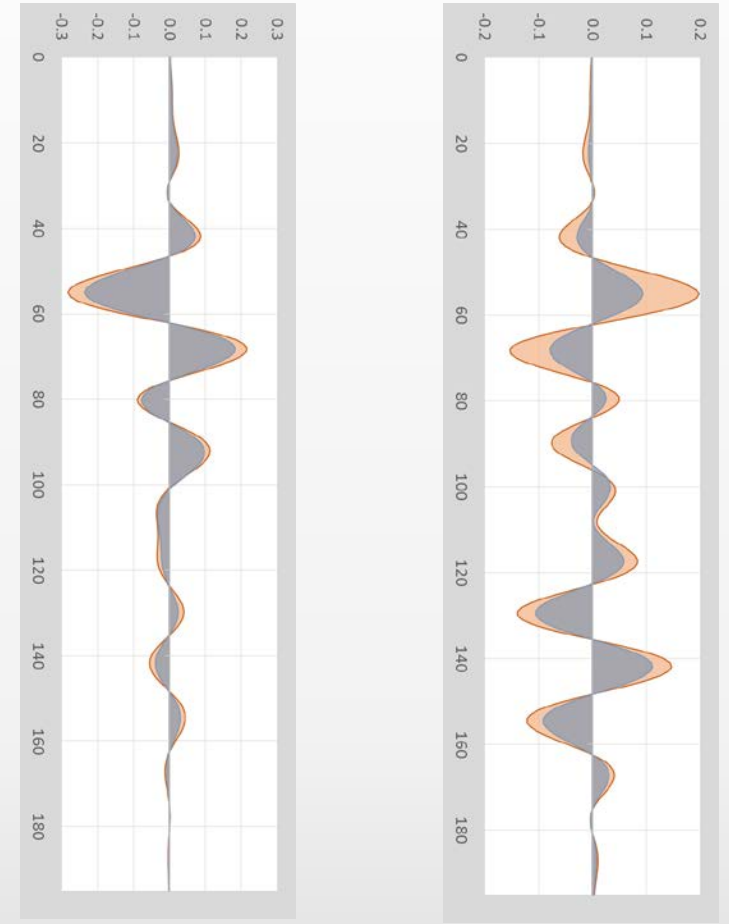
signal

noise

signal + noise  
5:1

Coherent noise:

- gradient measurement error
- 10% offset scaling error
- 10% angle estimation error
- 0.07 anisotropy ( $\delta$ ) contrast



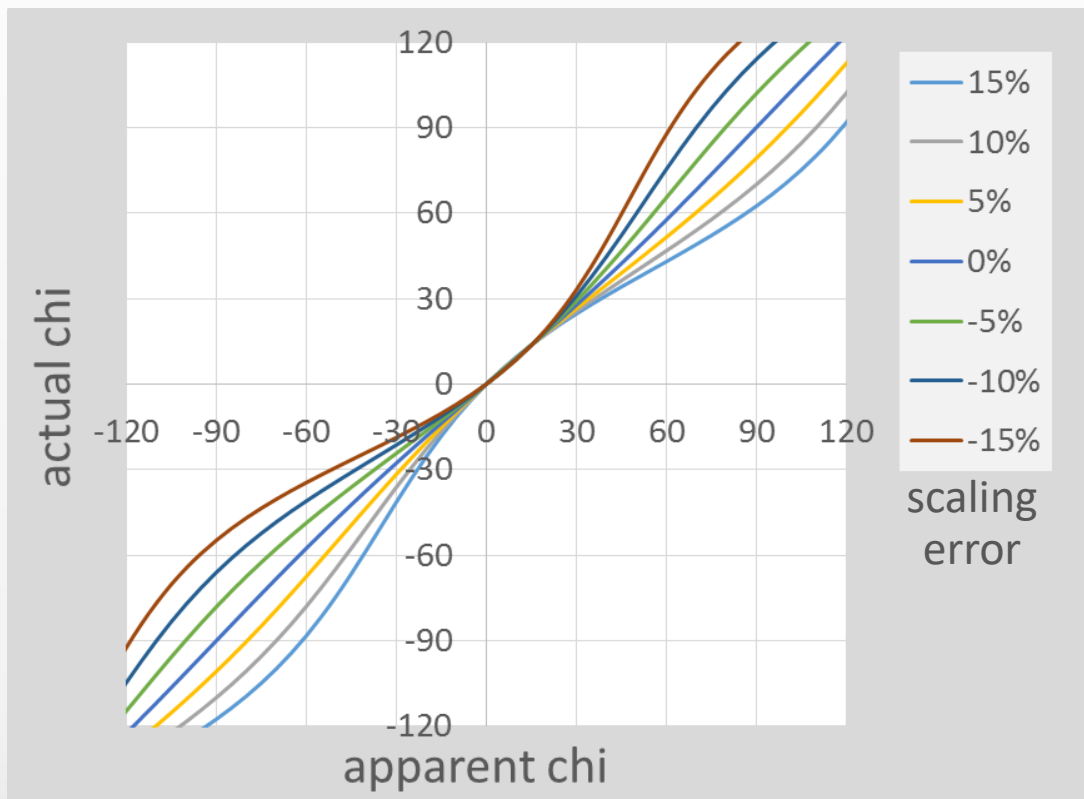
$\lambda\rho (\chi = 18^\circ)$

$\mu\rho (\chi = -45^\circ)$

# Seismic uncertainty

## Chi error curves

angle error = 10%, variable scaling error

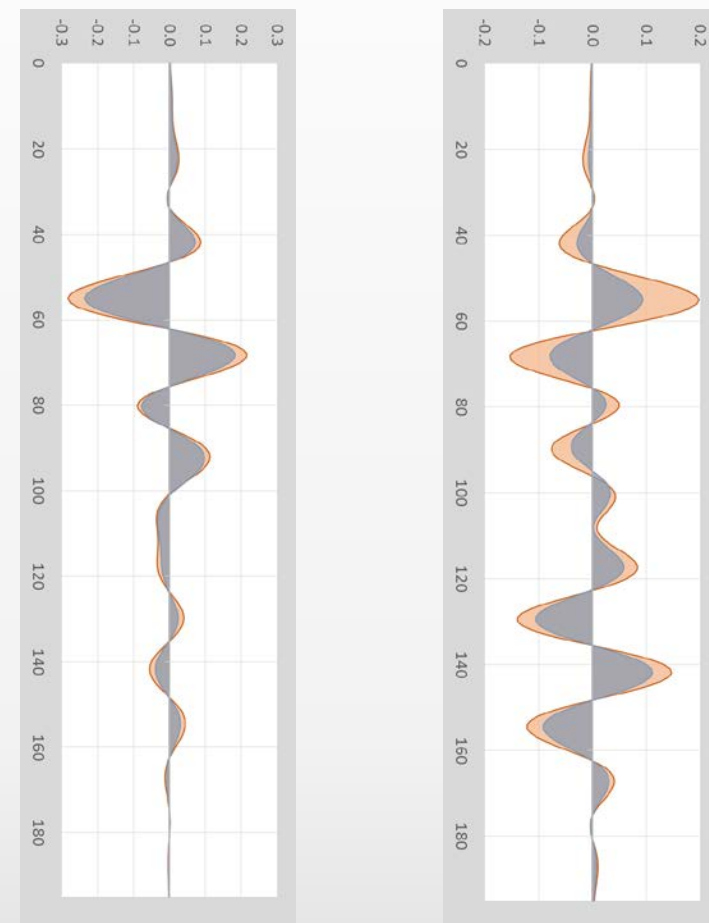


Actual  $\chi$  not equal to apparent  $\chi$   
because of gradient measurement errors

gradient measurement error

- 10% offset scaling error
- 10% angle estimation error
- 0.07 anisotropy ( $\delta$ ) contrast

Coherent noise:



$\lambda\rho$  ( $\chi = 18^\circ$ )

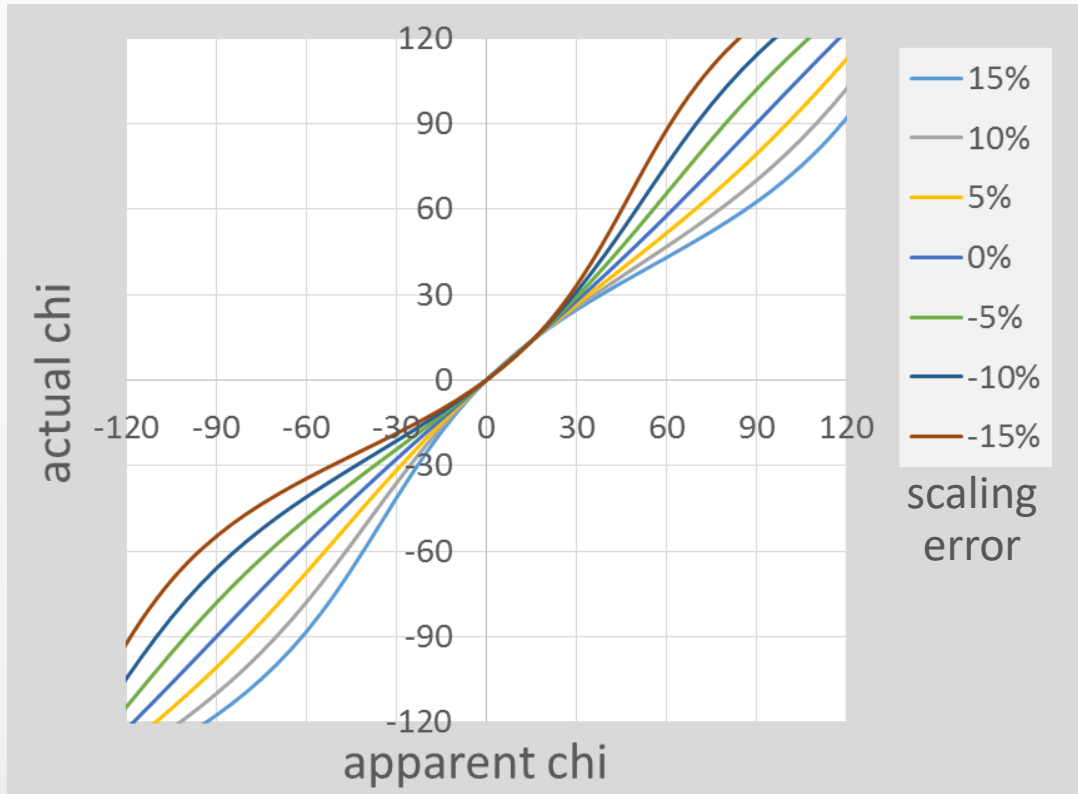
$\mu\rho$  ( $\chi = -45^\circ$ )



# Seismic uncertainty

## Chi error curves

angle error = 10%, variable scaling error



Actual  $\chi$  not equal to apparent  $\chi$   
because of gradient measurement errors

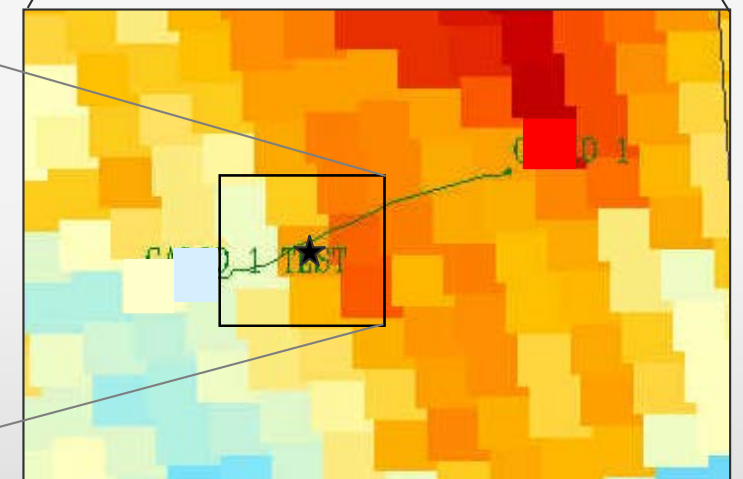
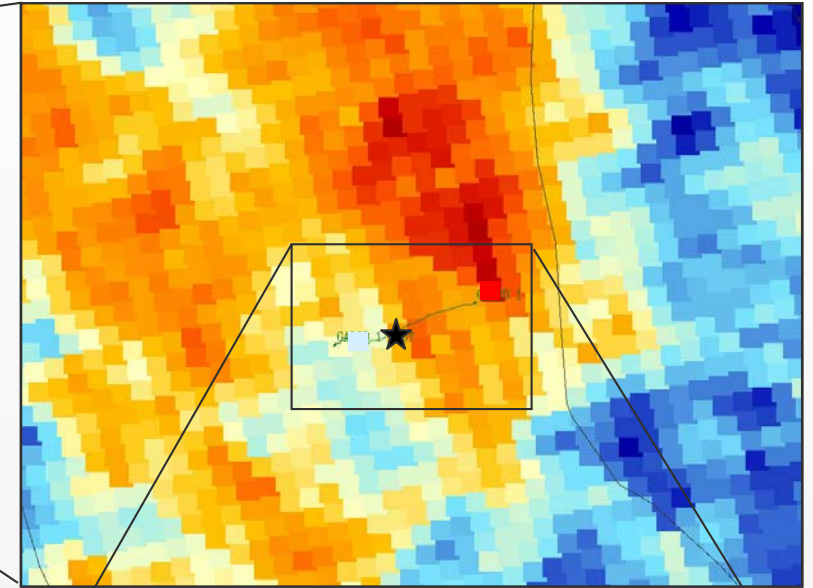
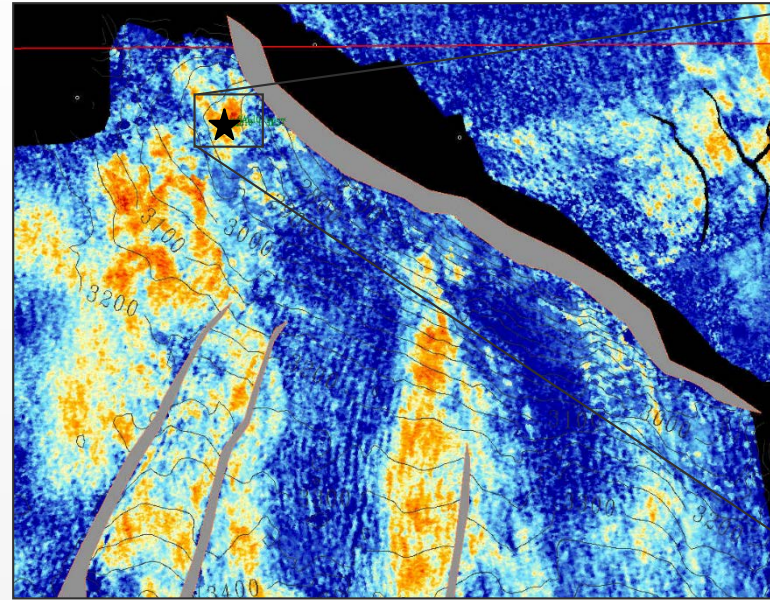
Characterise seismic  
uncertainty as uncertainty in  
chi angle?

Will depend on chi value and  
subjective assessment of;

- Scaling uncertainty
- Angle uncertainty (velocity uncertainty)
- Anisotropy uncertainty
- ...

# Well calibration?

Well-seismic positional uncertainty can result in significant calibration uncertainty



25m

3941	4140	5971
4676	4676	5450
4059	4593	4878

~±20%

# Percentiles: Blueback ODiSI

P5

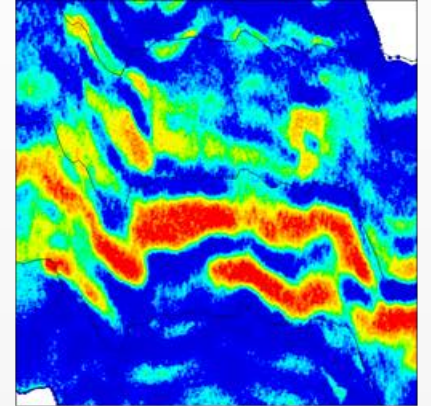
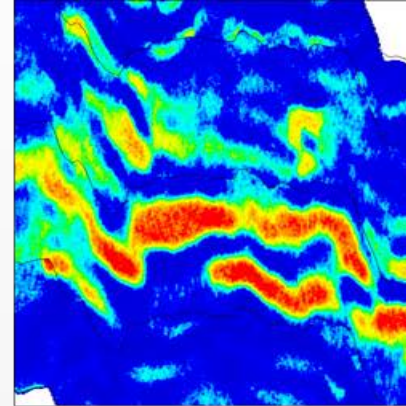
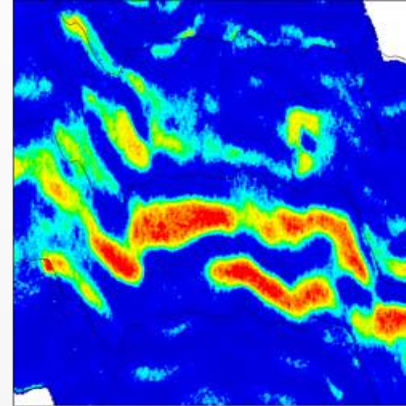
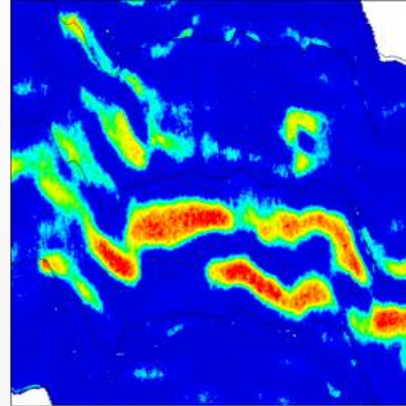
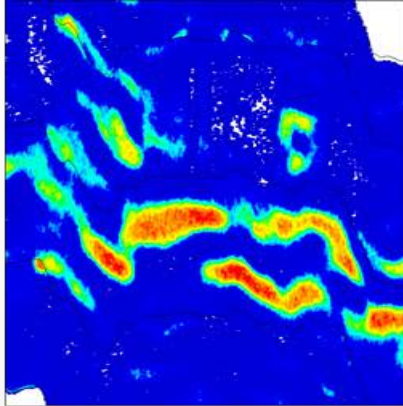
P25

P50

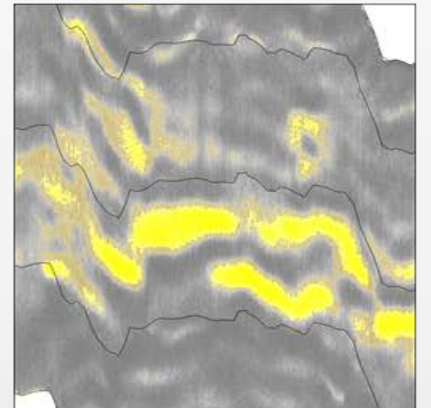
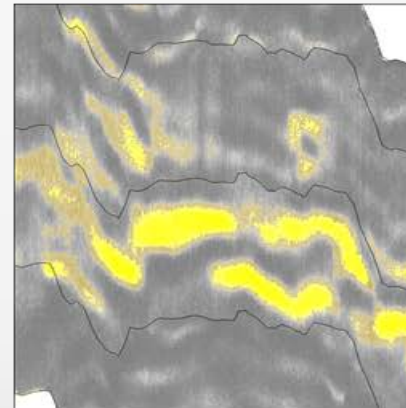
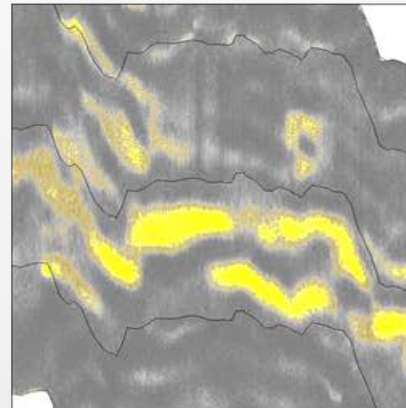
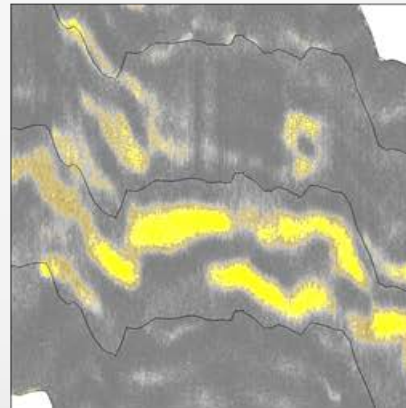
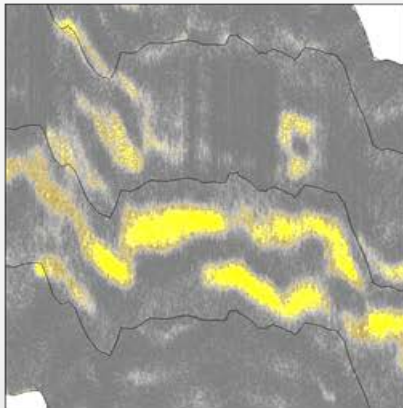
P75

P95

Mean  
net sand  
fraction

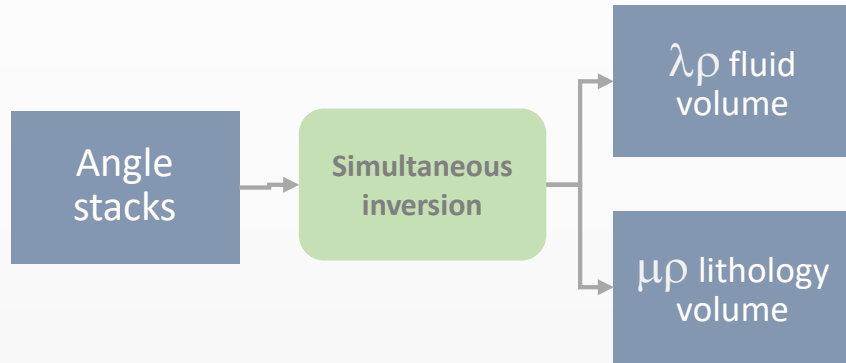


lithofacies  
(most likely)

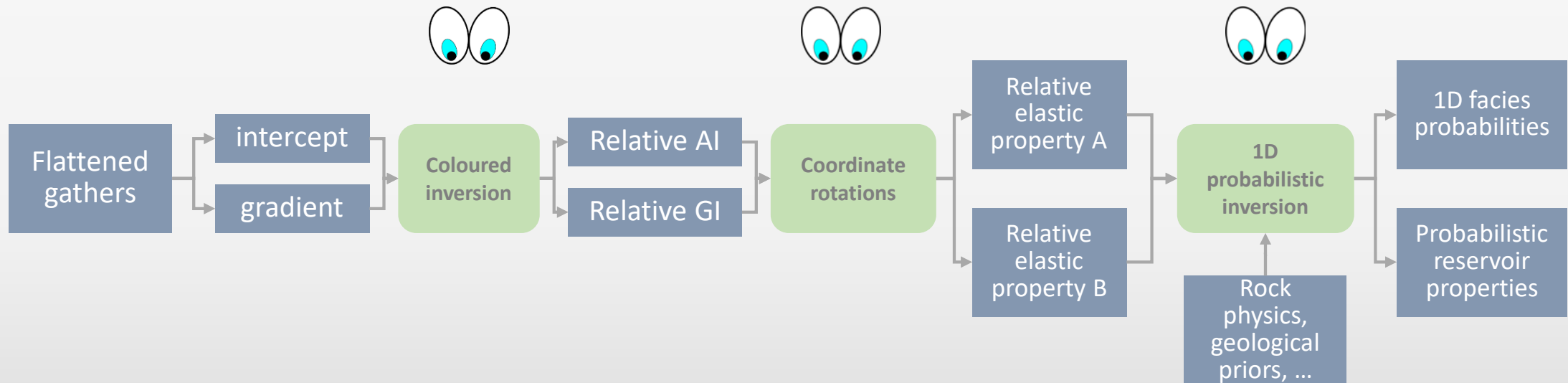


Ranges depend on subjective uncertainty values

# QI Workflows



- No bandwidth optimisation
- No gradient error mitigation
- No uncertainty quantification



# Summary

- QI workflows cannot be automated any more than processing workflows (yet).
- Focus on the largest unknowns and test options.
- Spread your workflows; use your judgement.
- Aim to develop '*... good methodology for when to use the computer and when to use ... human judgement*'

“No theory survives contact with the data”

# Acknowledgements

- Thanks to Cegal for Blueback ODiSI results.
- Thanks to Force for inviting me.
- Questions?

