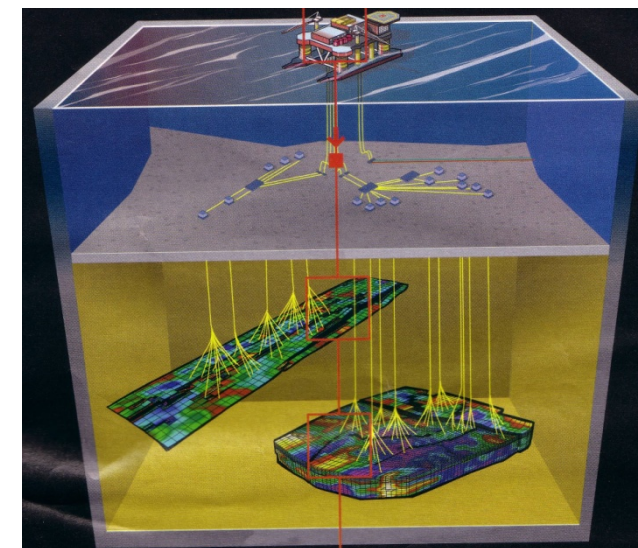


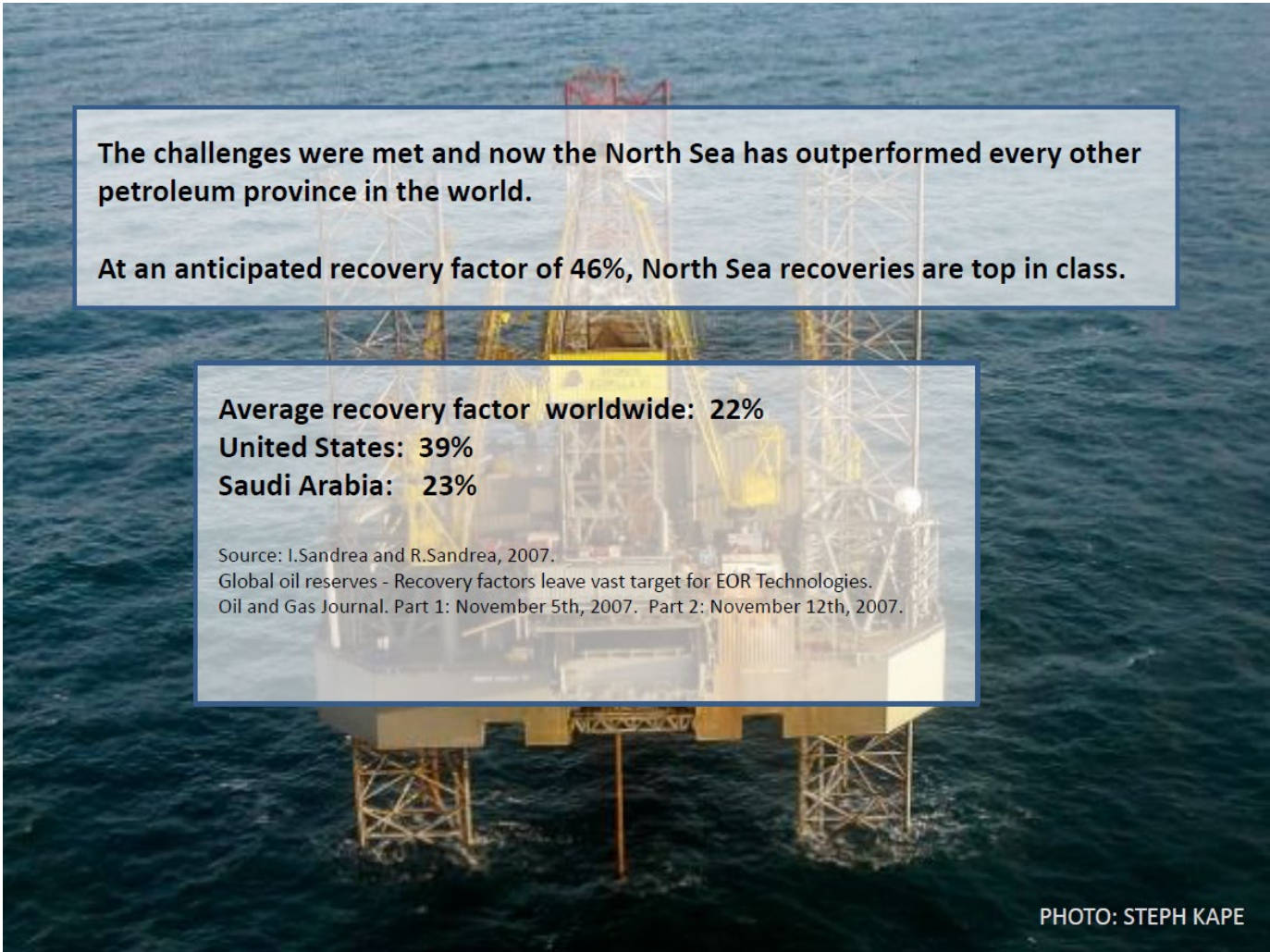
Infusing 4D seismic data into the third wave of automation (fourth industrial revolution?)

Colin MacBeth

Professor of Reservoir Geophysics
Heriot-watt Institute of
Petroleum Engineering,
Edinburgh, UK



Introduction



The challenges were met and now the North Sea has outperformed every other petroleum province in the world.

At an anticipated recovery factor of 46%, North Sea recoveries are top in class.

Average recovery factor worldwide: 22%
United States: 39%
Saudi Arabia: 23%

Source: I.Sandrea and R.Sandrea, 2007.
Global oil reserves - Recovery factors leave vast target for EOR Technologies.
Oil and Gas Journal. Part 1: November 5th, 2007. Part 2: November 12th, 2007.

PHOTO: STEPH KAPE

Shepherd (2016)

THE BIG SIX – A SCORE CARD		
FIELD	PRODUCTION 2016 Billion barrels oil	Recovery Factor as of 2016
FORTIES	2.74	~ 61%
BRENT	2.02	~ 53%
NINIAN	1.22	~ 47%
PIPER	1.09	~ 80%
MAGNUS	0.86	~ 56%
BERYL	0.84	~ 40%
TOTAL	8.77	

Introduction

SOME OF THE NEW TECHNOLOGY SINCE THE UK NORTH SEA STARTED UP IN 1975

1970s Routine use of 3D seismic (first survey shot by Exxon in 1967)

1980s Start of routine horizontal well drilling

1980s Increasing use of geostatistics in reservoir geology

1980s Locate The Remaining Oil techniques developed

1990s Common use of 3D computer models in reservoir geology

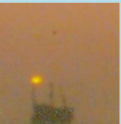
1990s Vastly improved resolution of 3D seismic

1990s Common use of 4D seismic

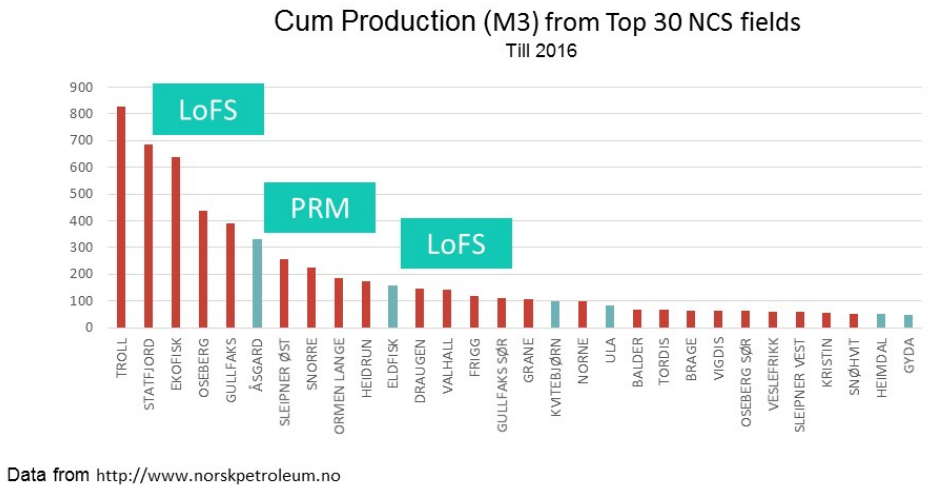
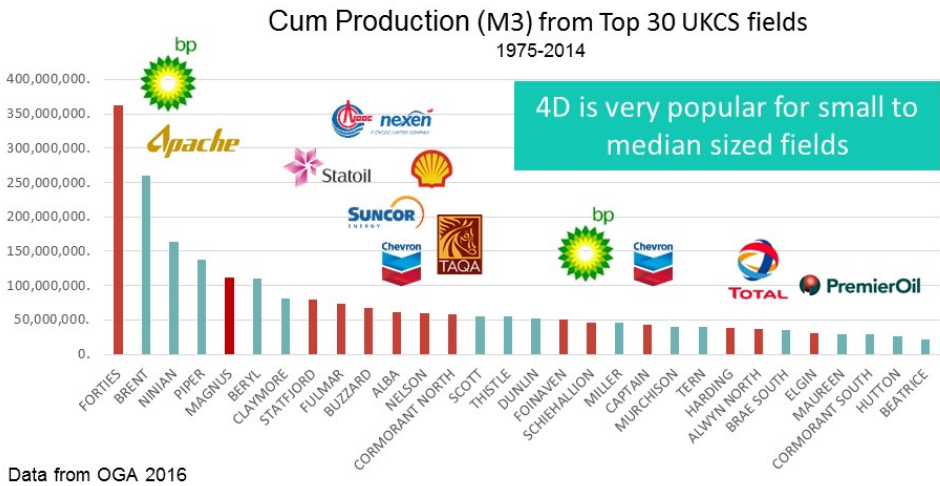
1990s Implementation of Enhanced Oil Recovery techniques

1990s Growing understanding of structural geology as applied to reservoirs

2000 Integrated reservoir management teams

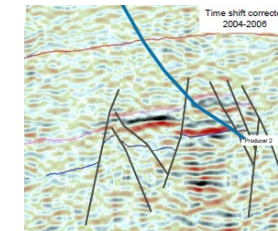
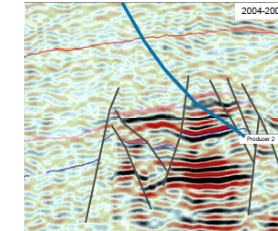
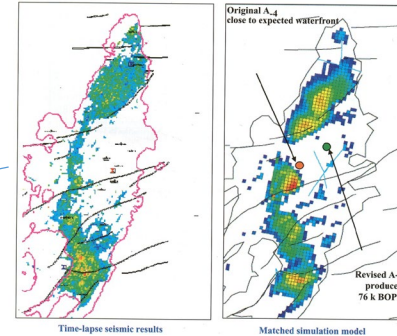


Shepherd (2016)



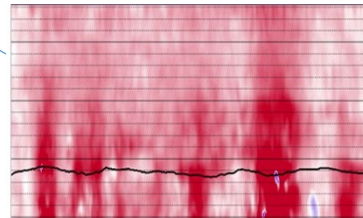
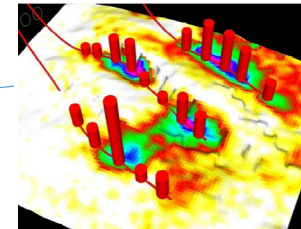
A selection of acknowledged benefits from using 4D seismic as a reservoir monitoring tool

- Re-pressurisation/displacement by water
- Re-pressurisation by gas
- Displacement efficiency
- Water over-run
- Flood movement
- WAG optimisation
- Gas exsolution and dissolution
- Baffles
- Compartments
- Faults and fault transmissibility
- Intra-reservoir connectivity
- Seismic PLT
- Geomechanical assessment
- Coning
- Perforation performance



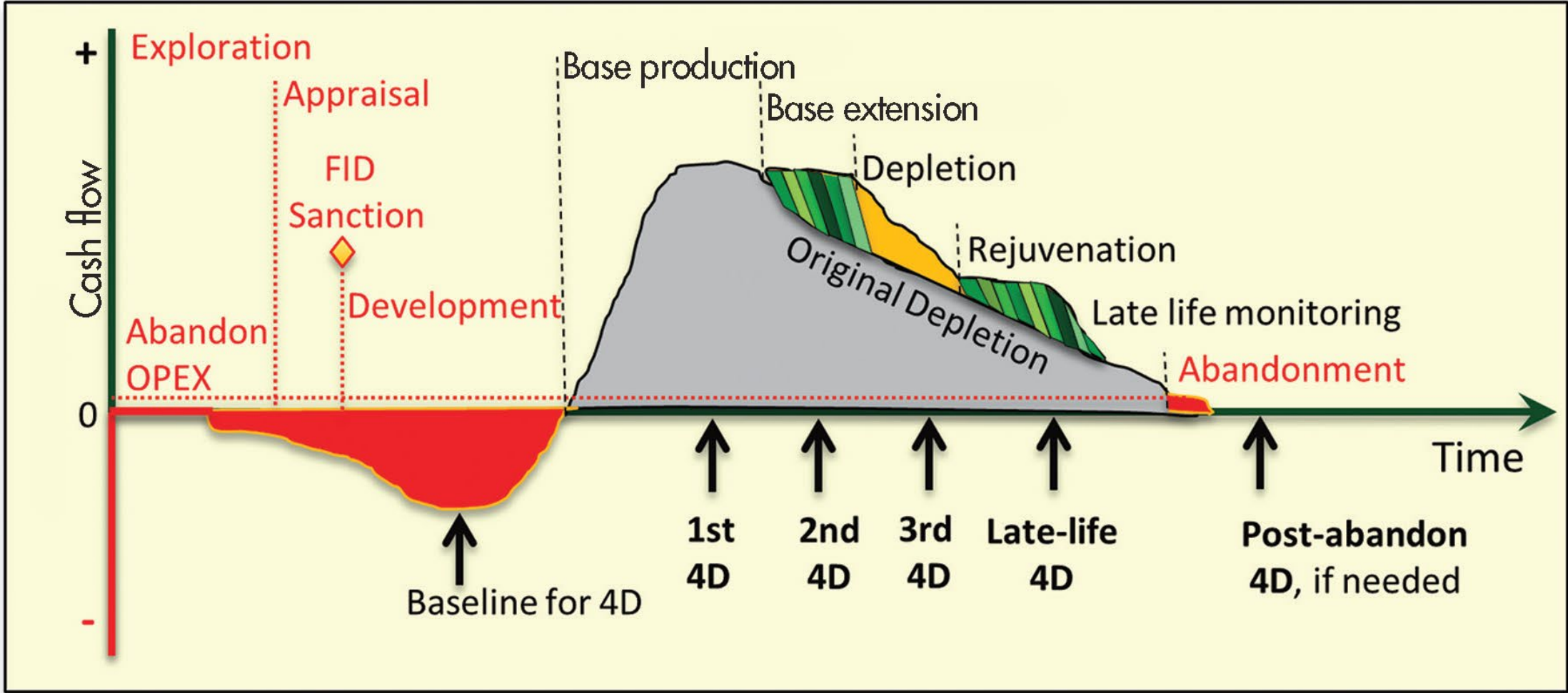
Alsos et al. 2009

- Seismic PLT predicts fractional flow profile (Barkved 2005, Gouveia 2004)



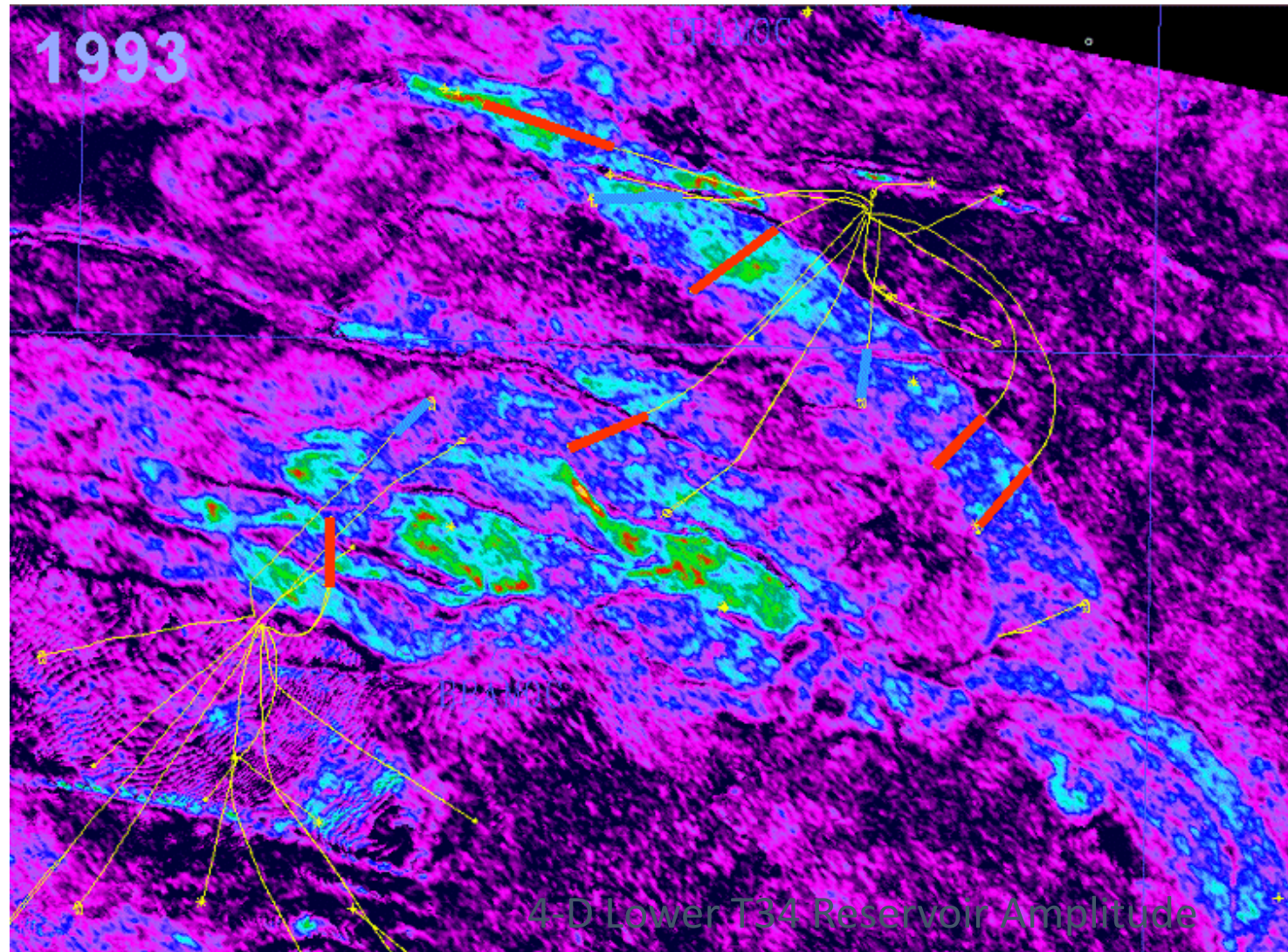
- In clastics, chalks, hard-rock carbonate, deep HPHT condensate, heavy oil, ...

Seismic surveillance throughout field life

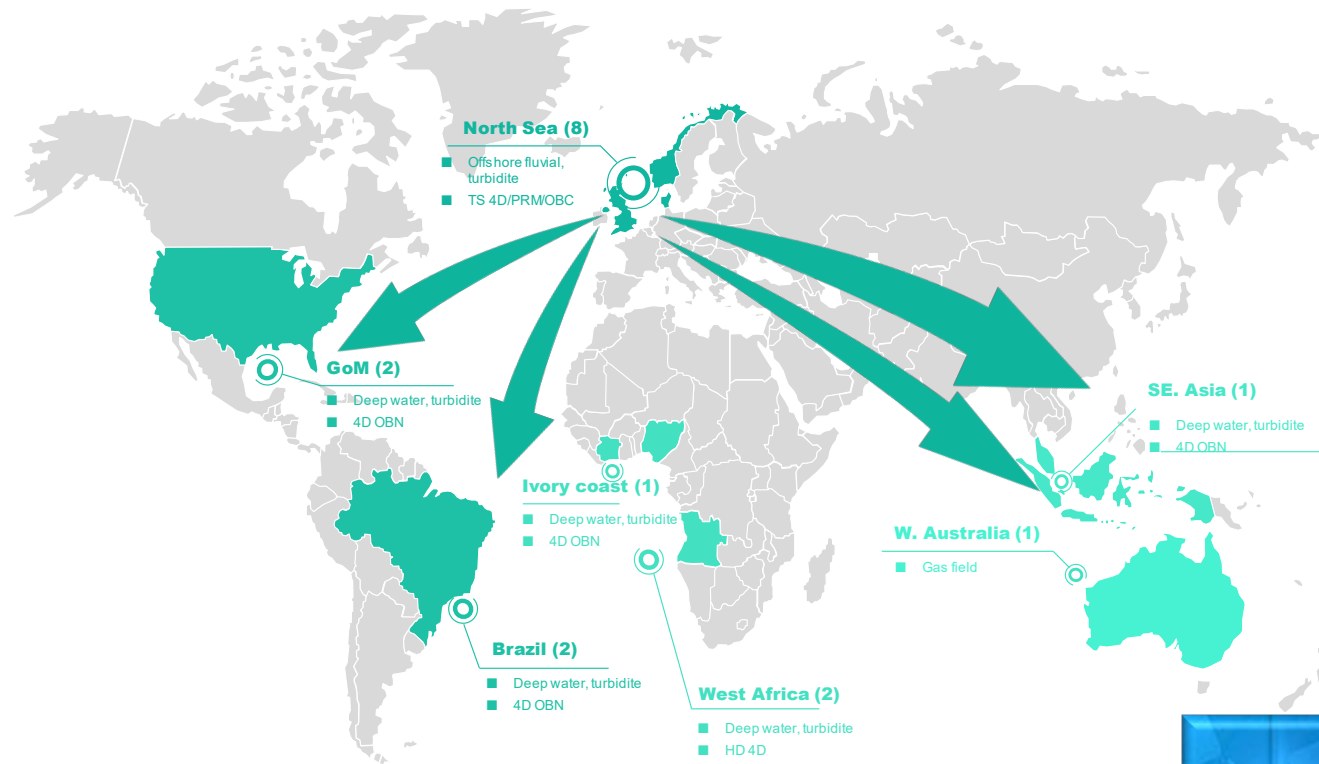


Blangy et al. 2017

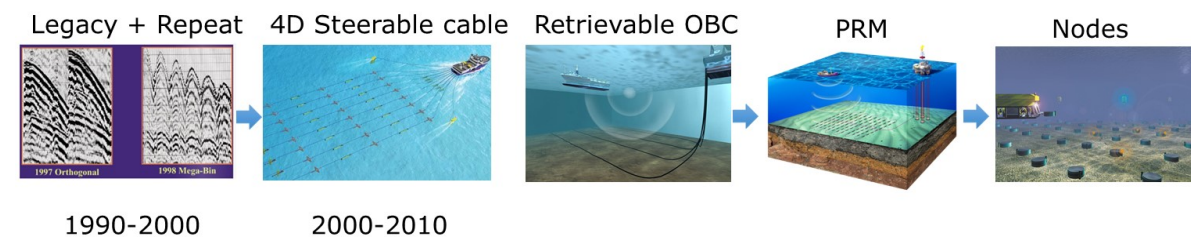
4D seismic as a tool for monitoring production and recovery



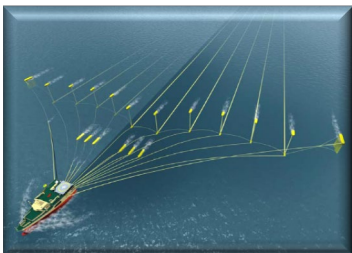
Global trends in application



Global trends - acquisition volume

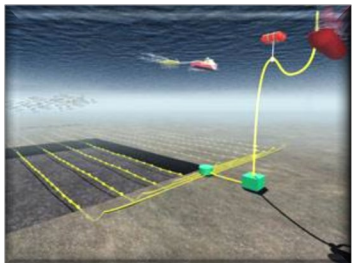


Towed streamer



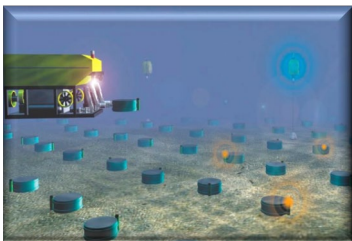
5Gb post-stack or 250Gb pre-stack

PRMs

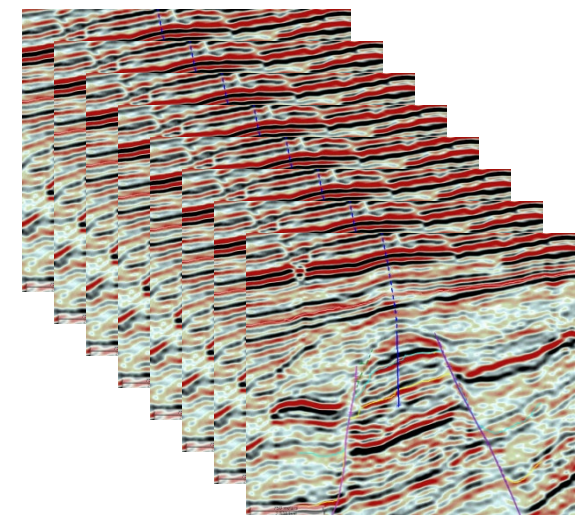


2Gb post-stack or 1Tb+ pre-stack

Nodes

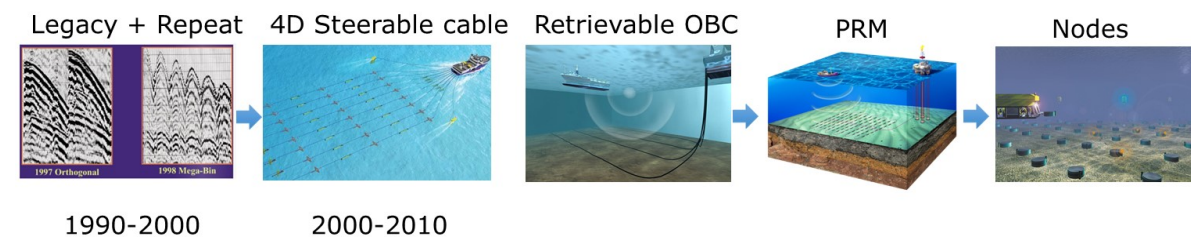


5Gb post-stack or 3Tb+ pre-stack

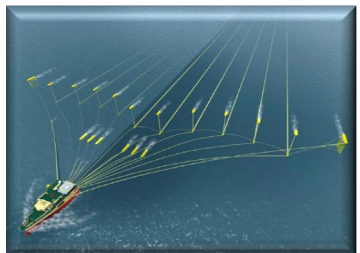


Processing and interpretation generates many more duplicates, updates, so cubes x 50 at least

Global trends - acquisition frequency

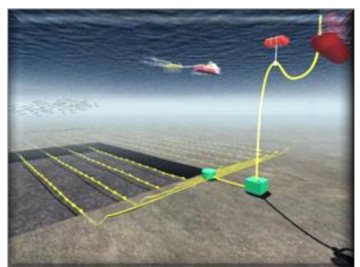


Towed streamer



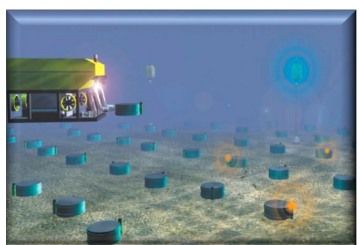
One every few years

PRMs

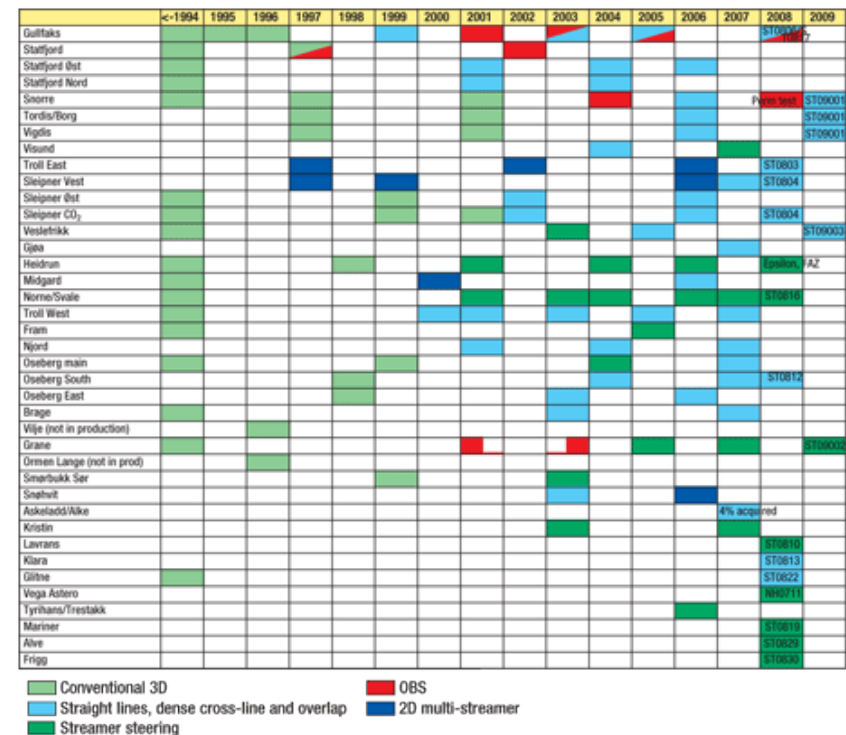
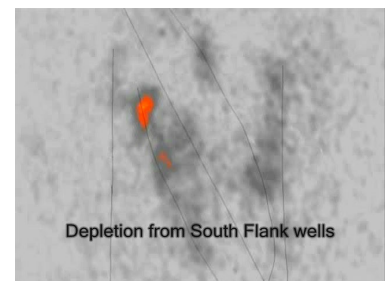
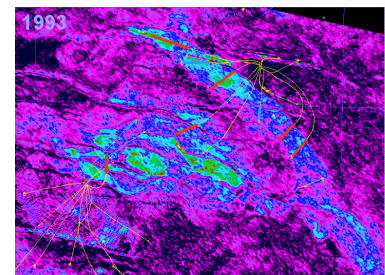


Two per year

Nodes



One every 6months to year or on demand



Sandø et al. 2009

Global trends – multiple data streams

Compaction

Simulation analysis

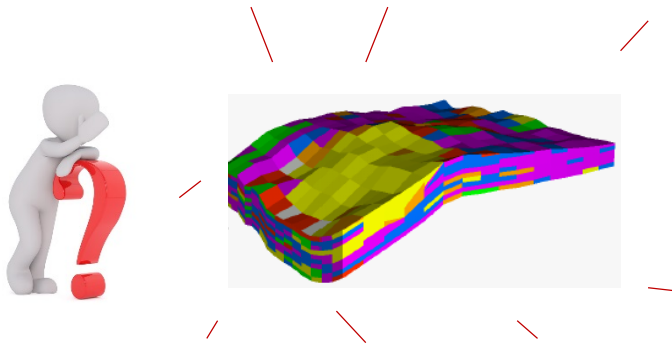
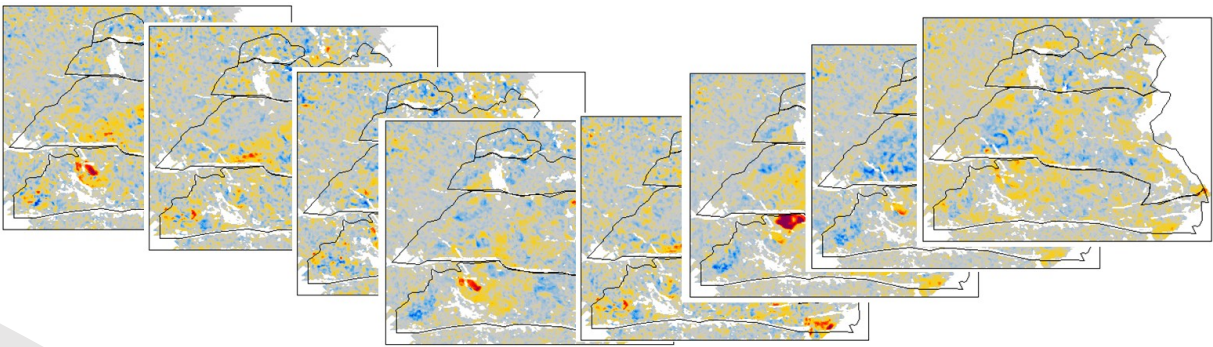
Saturation logs

Production/injection data

Tracer injection

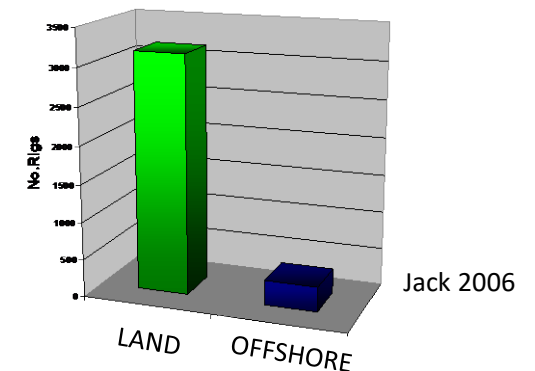
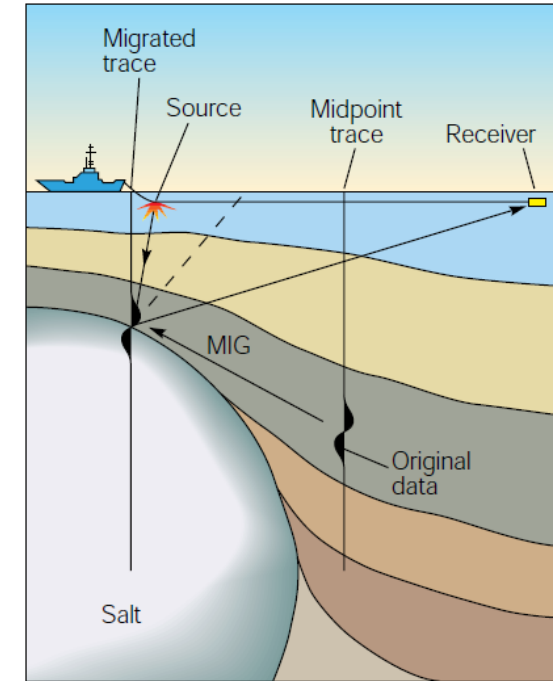
Injectivity analysis

Pressure transient analysis



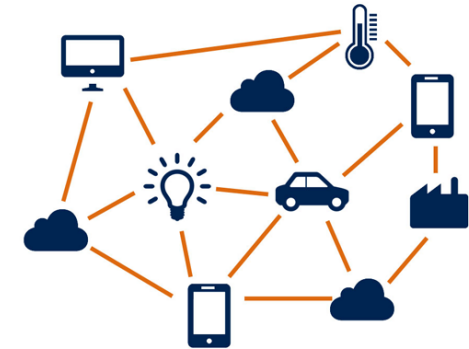
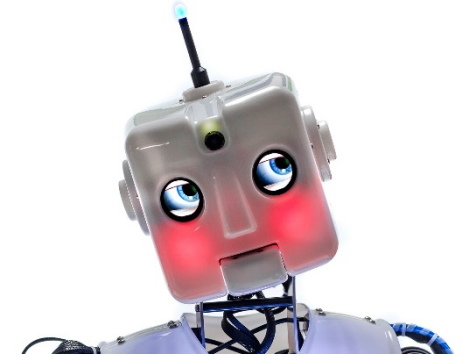
The drivers for tomorrow's technology

- Field targets will be more challenging
 - Mature/late life fields
 - Smaller signals
 - Thinner targets
 - More complex reservoirs (pre-salt versus Albian, Carbonates, stacked)
 - More complex mixed fluid environments
 - More sophisticated IOR and EOR chemistry
 - Deeper targets
 - Deeper water
 - More geo-hazards
- Our technology must address the socio-economics of the future, we will demand much **more for less** regardless of the oil price
- Higher **quality** data, more volume
- Reduced environmental impact
- Land versus marine
- **The technical backdrop – the influence of significant improvements in worldwide technology**



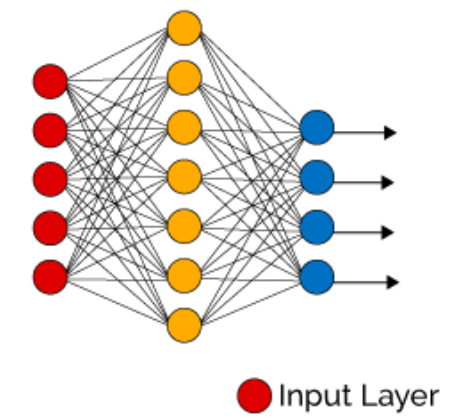
Selected, relevant, fast-paced technologies outside the oil and gas (energy) sector

- Electronic engineering **Moore's law** continues to be applicable, predicting a favourable increase in computer power by 1 million by 2040, but with a pessimistic (realistic) limit of only 10!
- Quantum/optical **computing** – too early for these to be useful
- Massive increase in **data storage** – in proportion to Moore's law
- Internet of things – **mass connectivity** of devices at all scales in society commensurate with increase in processor power. Smart technologies are expected to be the norm.
- **Global internet coverage**, mass corporate communication
- Machine learning/'Big Data'/AI/robotics - **data analytics**
- **Block chain**
- **Virtual and augmented realities**
- **Cloud computing and storage**

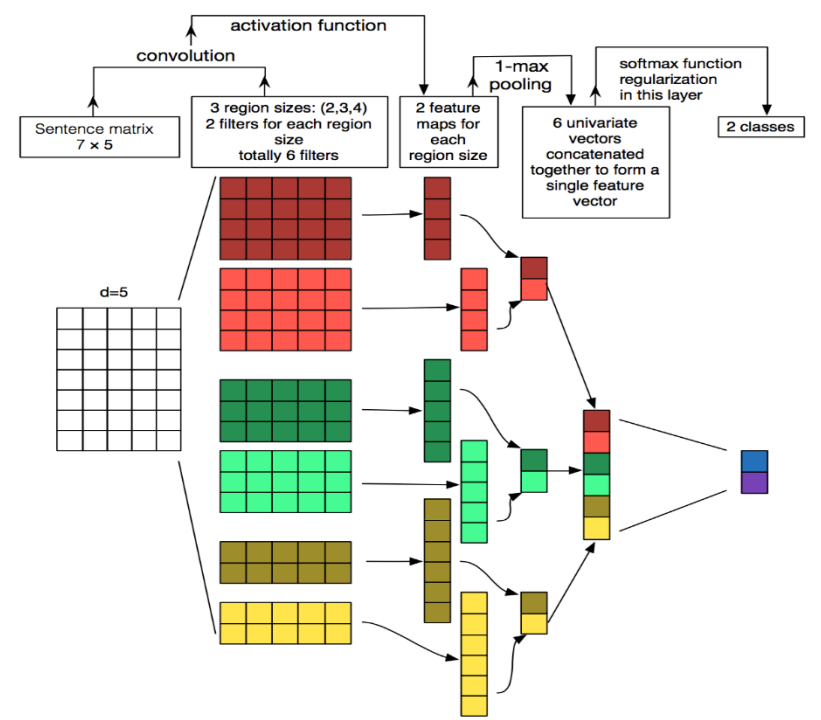
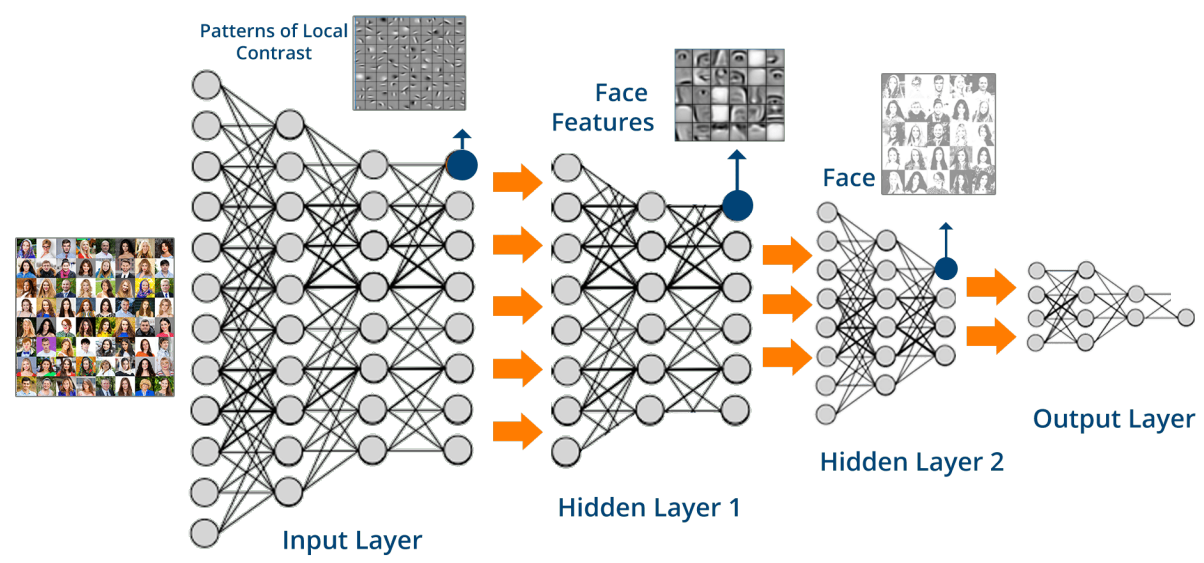
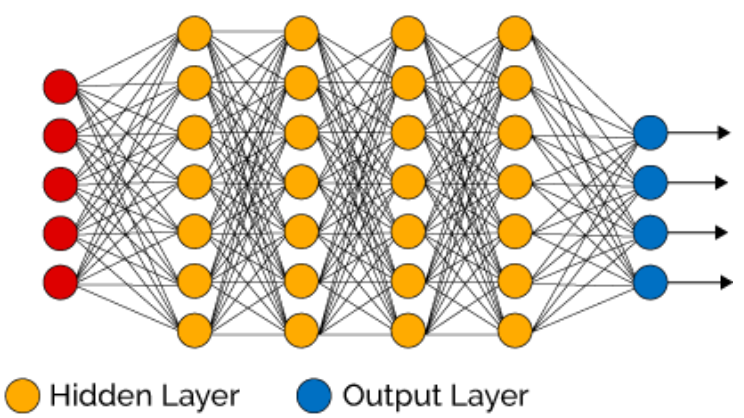


The new wave is in full swing!

Simple Neural Network

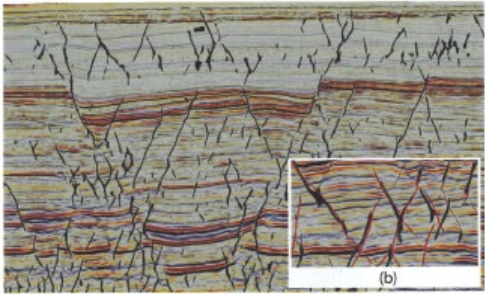
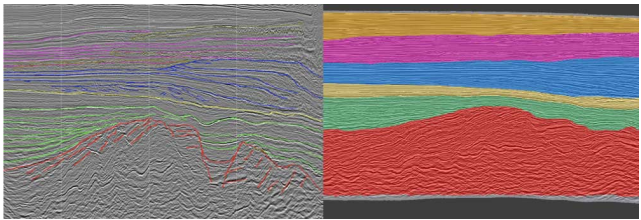


Deep Learning Neural Network

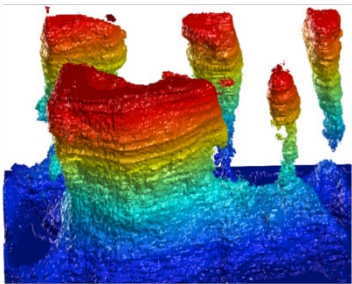
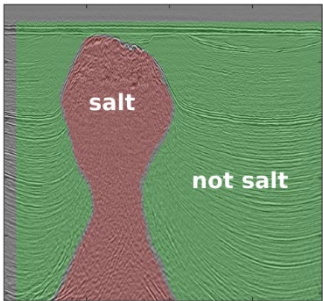


ML – conventional applications in seismic

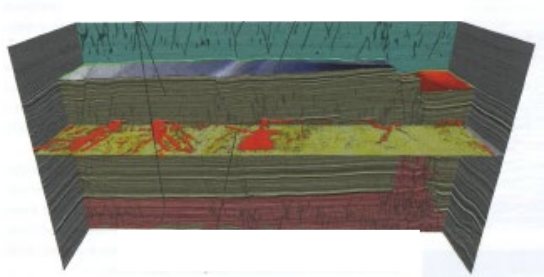
Structural or stratigraphic interpretation



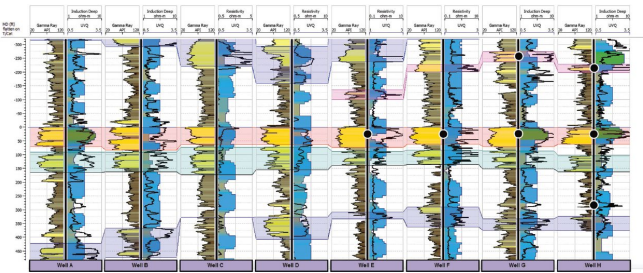
Faults/geobodies/chimneys/salt
Hence model building



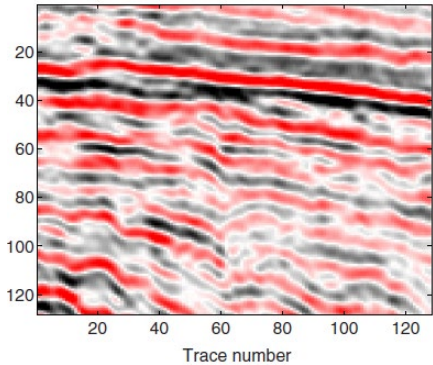
Agilescientific



Lithofacies & saturation identification

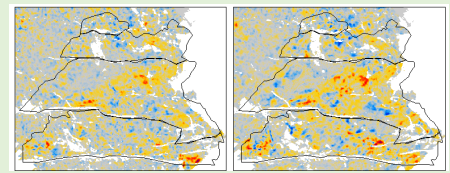


Processing QC, interpolation/reconstruction



Easy gains for the 4D toolbox

Anomaly interpretation

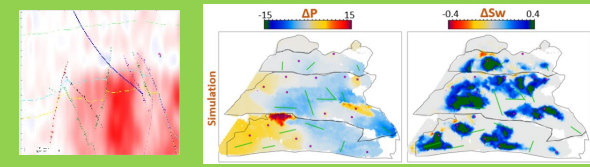


4D well tie

4D imaging

Sim2seis modelling

Property inversion

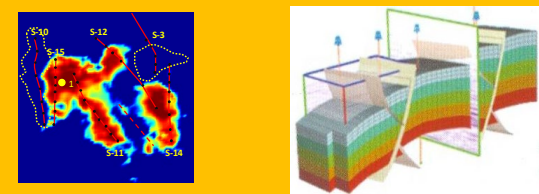


Stress and geomechanics

Pressure and saturation estimation

4D inversion to impedance

Model updating

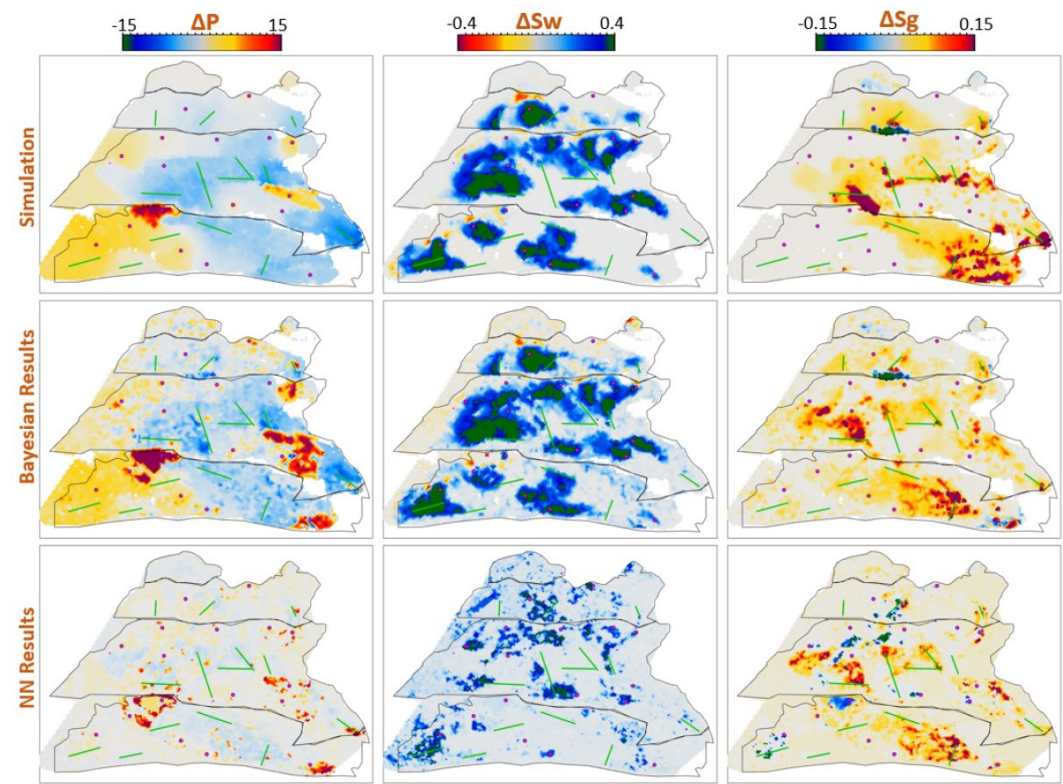


Dynamic model updating

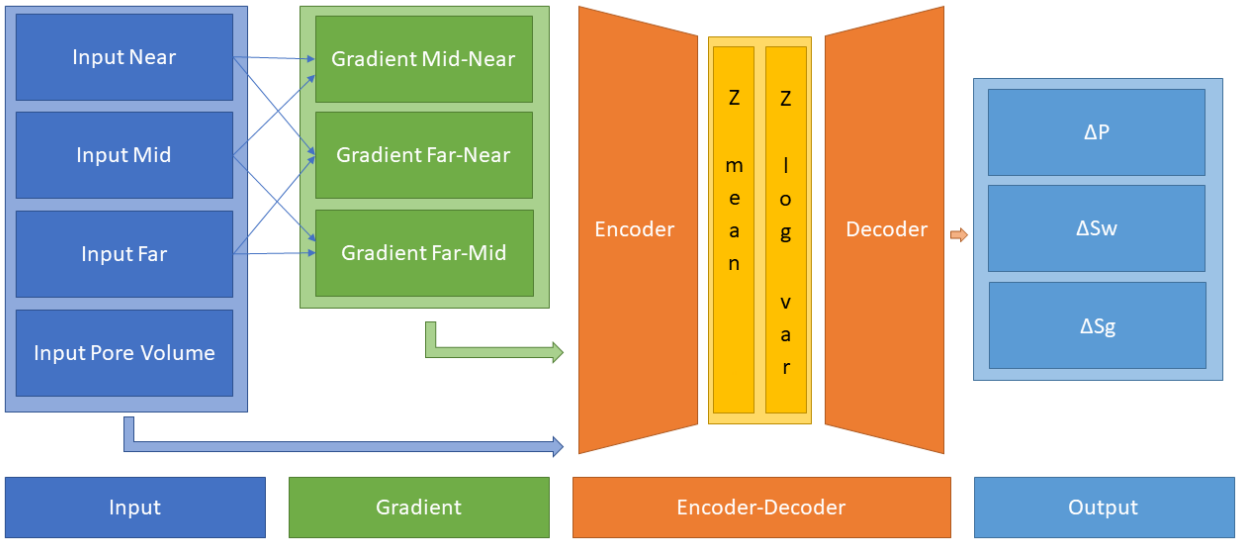
Seismic history match

Well2seis connectivity analysis

Easy gains: example 1 – pressure and saturation inversion

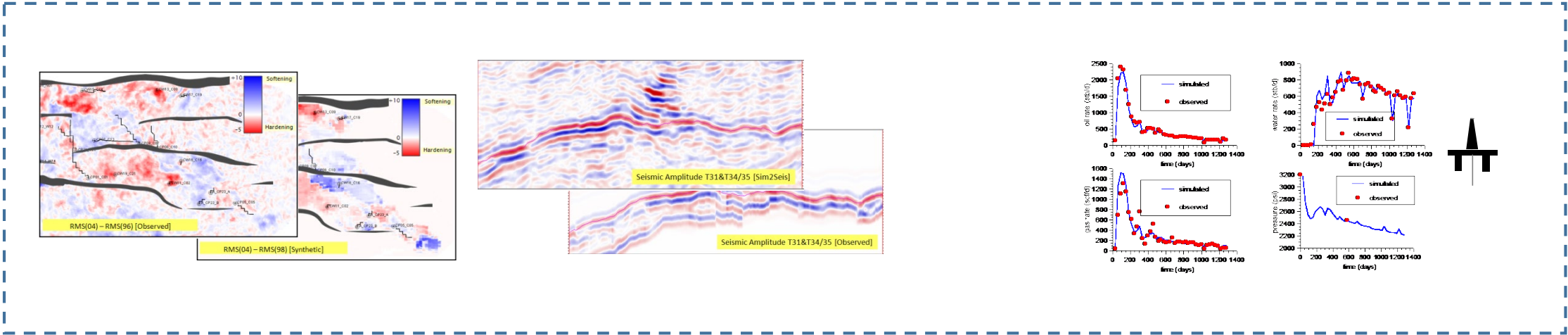


2004 time-step – Bayesian inversion versus neural inversion

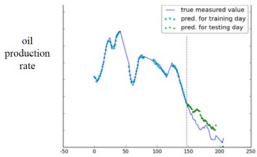


Dramsch et al. 2019

Easy gains: example 2 – the seismic history match



NN solution

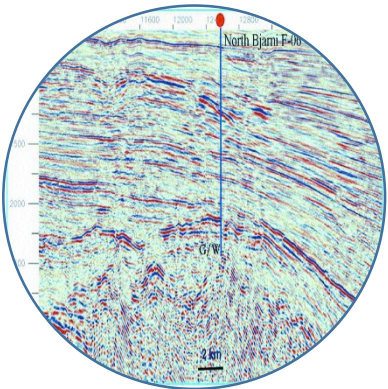


Production
forecast

The bigger picture

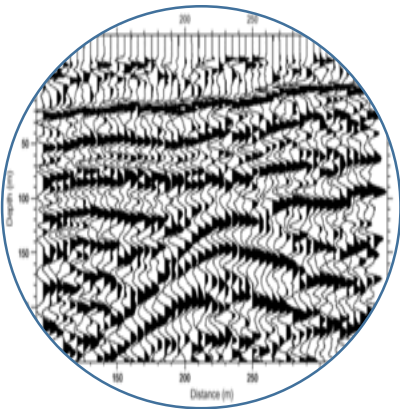


Exploration



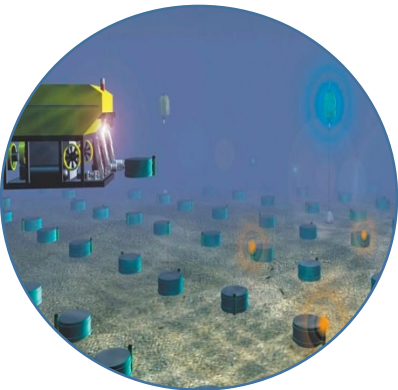
Years

Processing



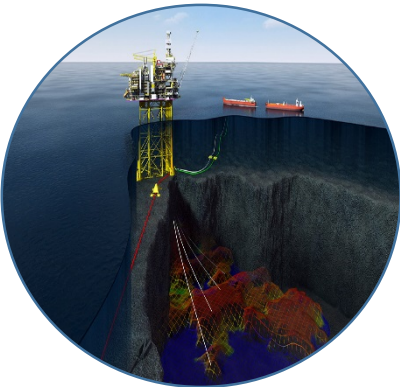
6 to 12 months

4D seismic acquisition

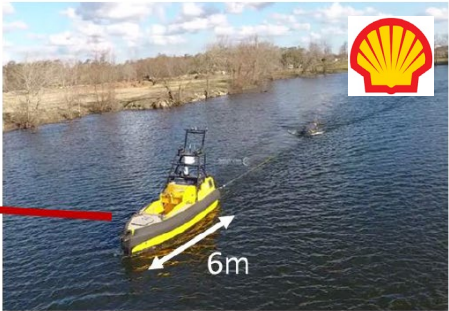


3 months

*Interpretation, model building
and decision making*



1 – 2 years



Chalenski et al. (2017)

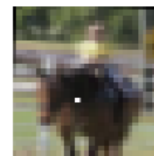
One Pixel Attack for Fooling Deep Neural Networks

Jiawei Su*, Danilo Vasconcellos Vargas* and Kouichi Sakurai

AllConv



SHIP
CAR(99.7%)



HORSE
DOG(70.7%)



CAR
AIRPLANE(82.4%)



DEER
AIRPLANE(49.8%)



HORSE
DOG(88.0%)

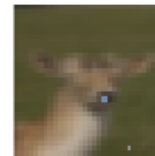
NiN



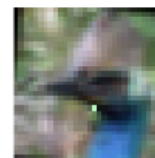
HORSE
FROG(99.9%)



DOG
CAT(75.5%)



DEER
DOG(86.4%)

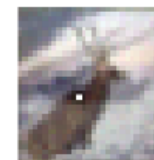


BIRD
FROG(88.8%)



SHIP
AIRPLANE(62.7%)

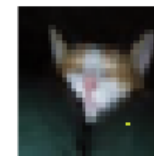
VGG



DEER
AIRPLANE(85.3%)



BIRD
FROG(86.5%)



CAT
BIRD(66.2%)



SHIP
AIRPLANE(88.2%)



CAT
DOG(78.2%)

Education and technology in an ever-changing ML landscape

- Rapid societal change: technology + workforce demographics – baby boomers retiring, millennials and Gen-Z
- TU Delft: *'A thunderstorm for which there is little time to prepare'*
- Morgan Stanley: *'The sector that could see the most profound benefitsO&G'*
- *Role and nature* of education/training - industry & university
- *Mismatch* between employee skills and employer, need for alignment between providers
- *Classic learning model* will fail as massive change occurs
- Re-shape *cultures and practices* – e.g. new learning designs by Deloitte
- Data scientist or geoscientist?

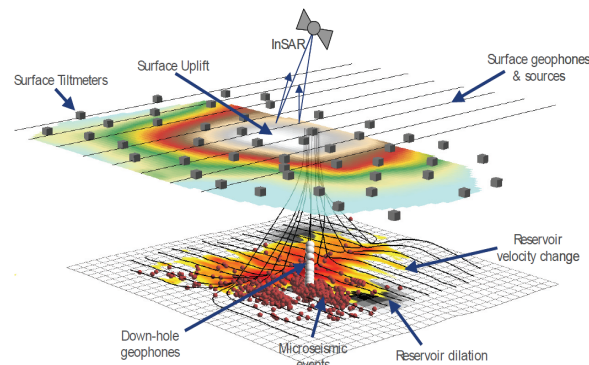


London 2019

Dedicated session on 'Education in the future'

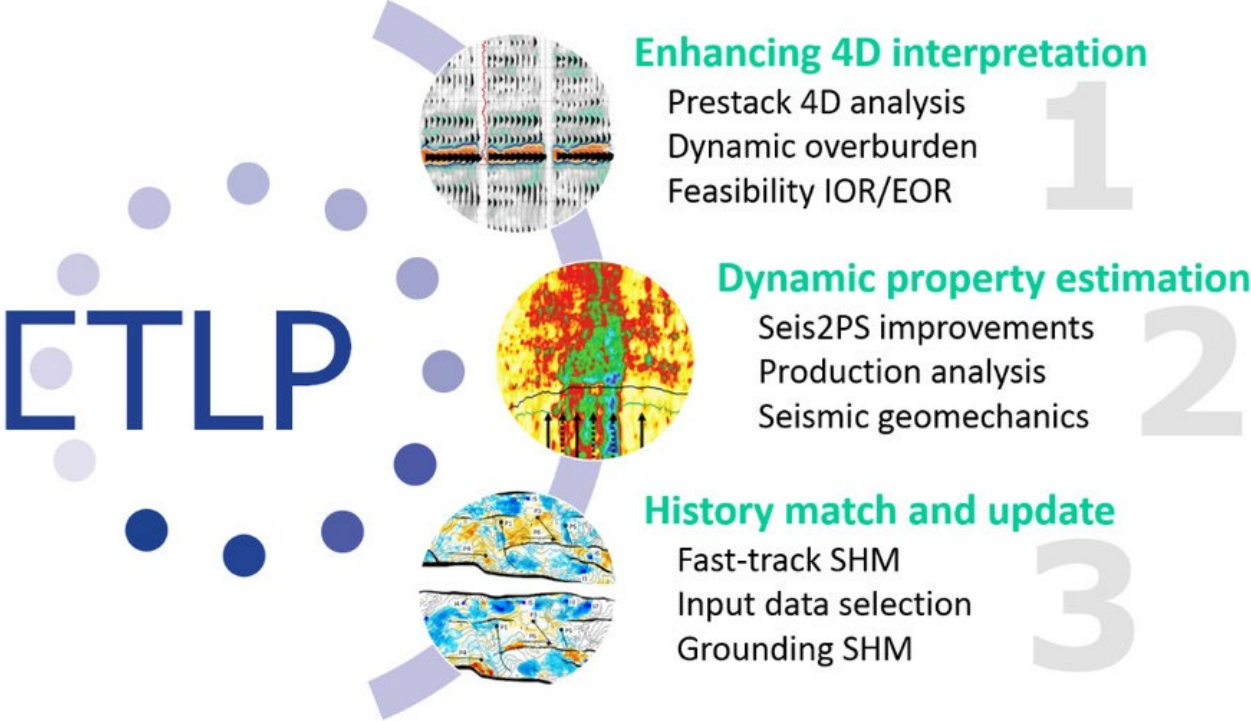
Closing remarks

- An industry transformation is upon us
- Machine learning/Deep learning is maturing to the point where data can be put back at the core again
- **However the playing field of the near-future will not be the same** - we will be playing 7 a side football and not with the full 11, played with a small rugby ball and hockey sticks, and smaller goals. Player of tomorrow must be fast, fit, skilful and broadly educated to handle the new generation game.
- Education/training/learning will need to be flexible, mobile and immersive
- Will ML/DL deliver 'more for less'?

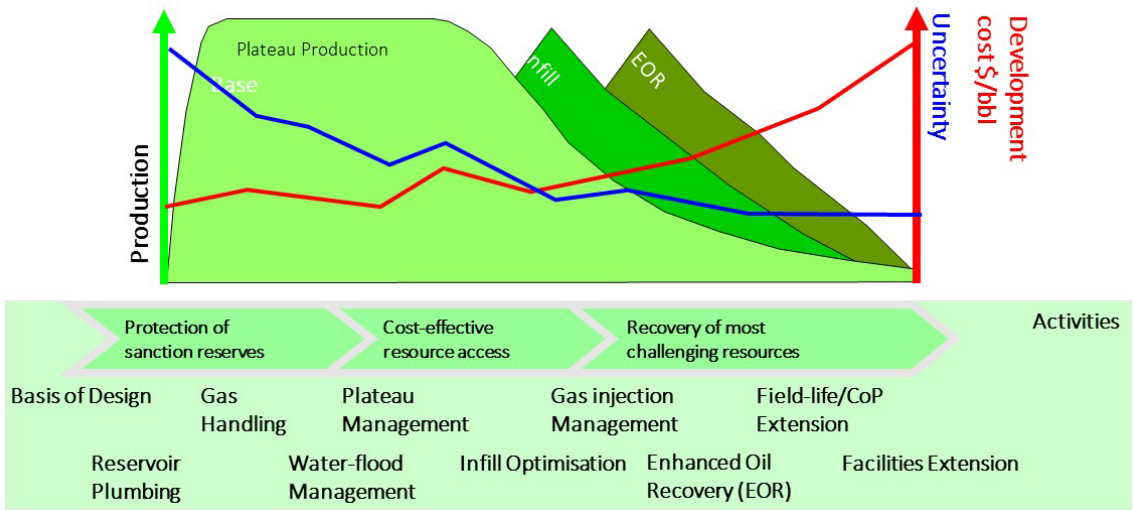
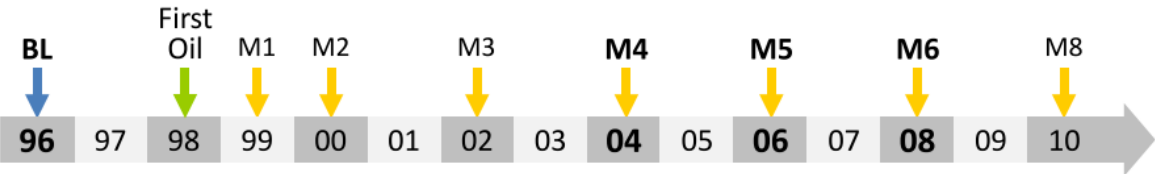
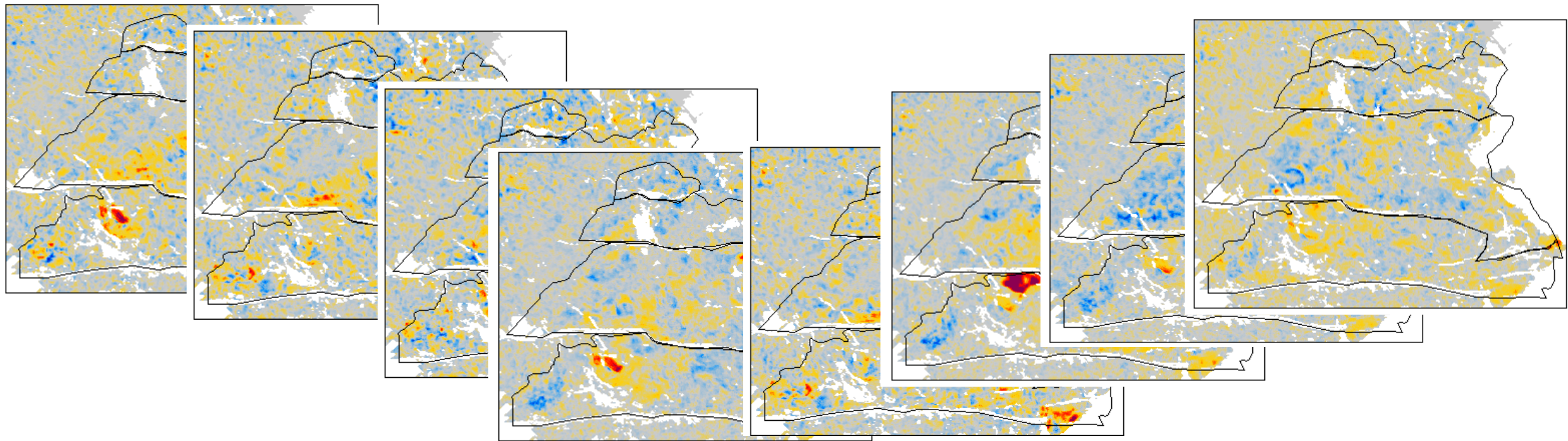


Acknowledgements

We thank the sponsors of the Edinburgh Time-Lapse Project, Phase VII for their continued support and discussion.

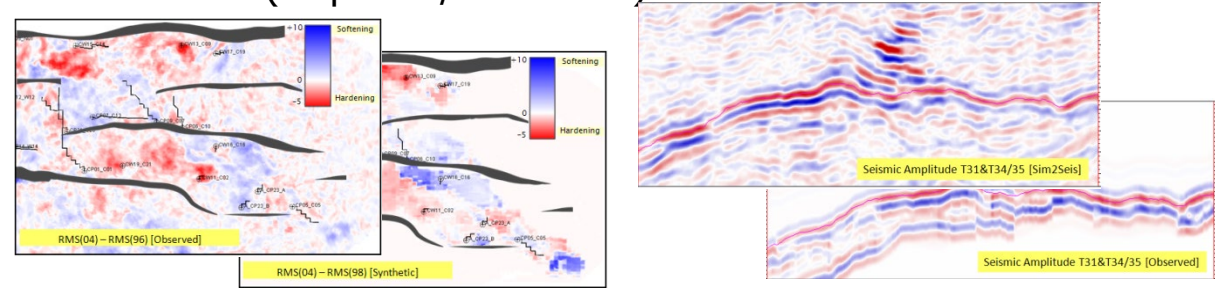


Emerging bottlenecks in 4D seismic interpretation



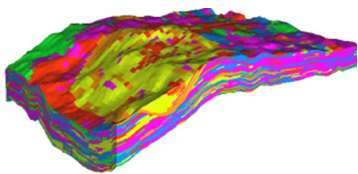
Easy gains: example 2 – the seismic history match

Direct comparison of predictions for seismic data (maps and/or sections)



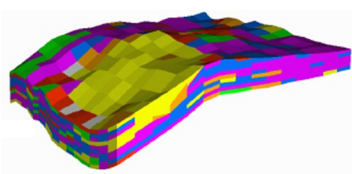
Simulate,
adjust model
and re-simulate

Geological model

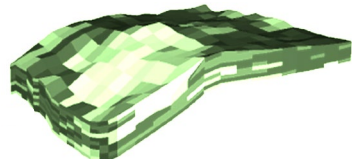


Upscale

Simulation model



Simulate,
adjust model
and re-simulate



Improved simulation model
or many realisations

Direct comparison of
predictions to well data

