



# An integrated 4D seismic inversion workflow applied to the Catcher fields

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Edinburgh Time-Lapse Project <sup>(1)</sup>  
Harbour Energy <sup>(2)</sup>



# Contents

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- Overview of the Catcher area fields
- Petro-elastic model calibration
- Deep Neural Network (DNN) inversion
- Bayesian inversion
- Uncertainty quantification

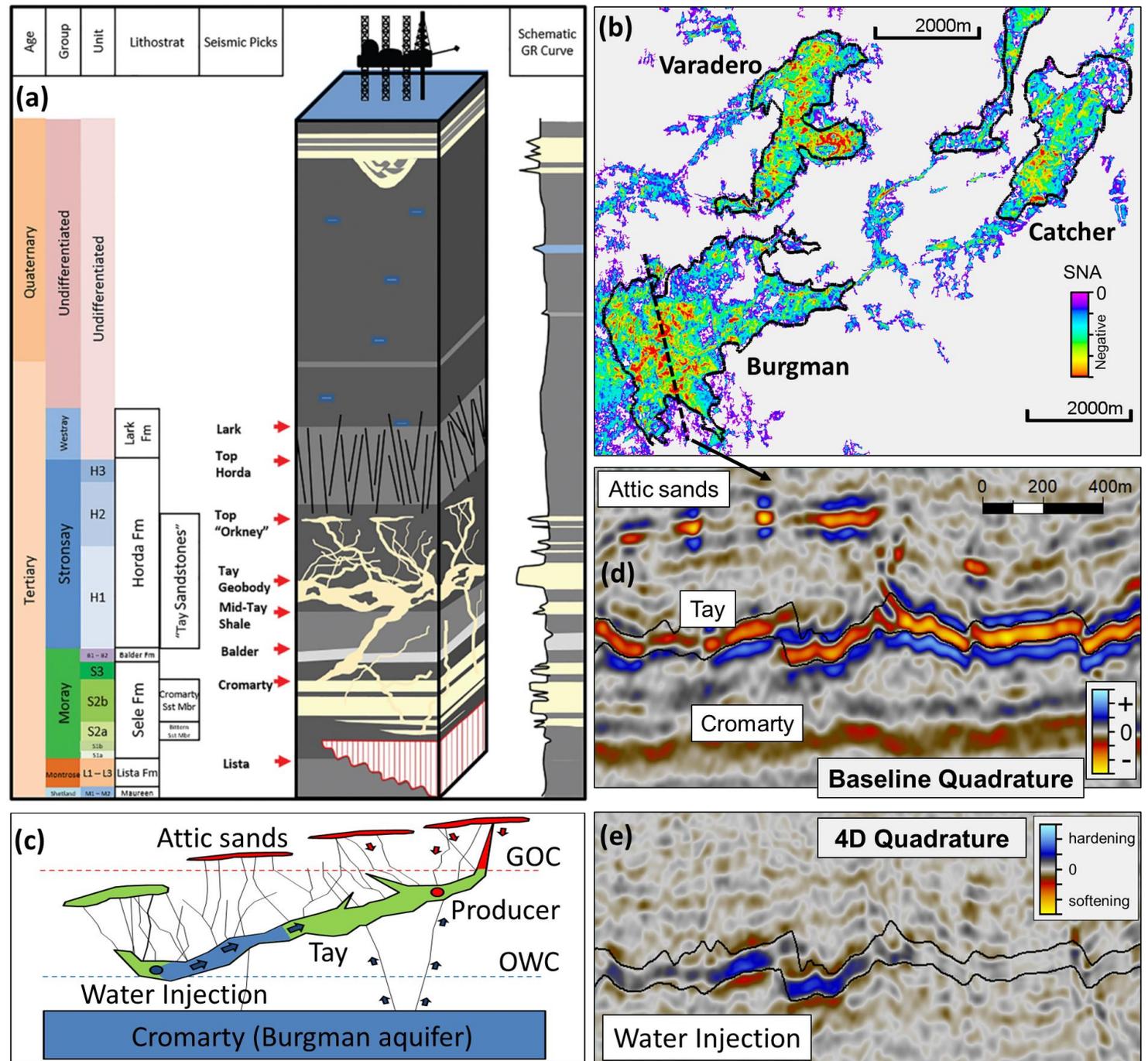
**An Integrated Workflow for the Probabilistic Estimation of Pressure and Saturation Changes from 4D Seismic Data: Application to the Catcher Fields, Central North Sea**

[Gustavo Côrte](#), [Sean Tian](#), [Gary Marsden](#), [Matthew Gibson](#), [Colin MacBeth](#)

**First Break**, Volume 41, Issue 3, Mar 2023, p. 49 - 55

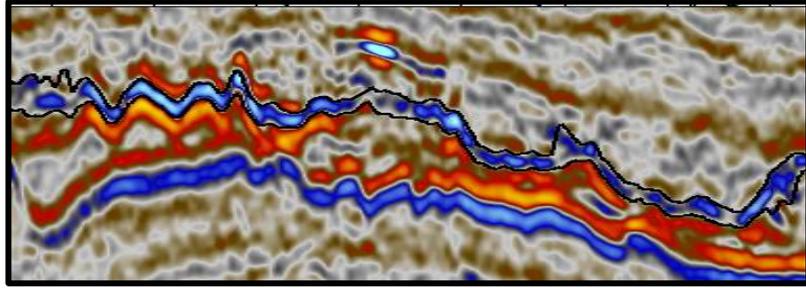
# The Catcher area fields

- Clean sandstone injectites
- 35% porosity
- 3 Fields under development
  - Catcher, Varadero & Burgman
- Oil bearing Tay reservoir  
Cromarty aquifer  
Gas bearing attic sands
- Water injection (dedicated injection wells)
- Gas injection (intermittently through producer wells)
- Dedicated 4D seismic
  - ~3.5 years of production
  - High repeatability (NRMS ~11%)

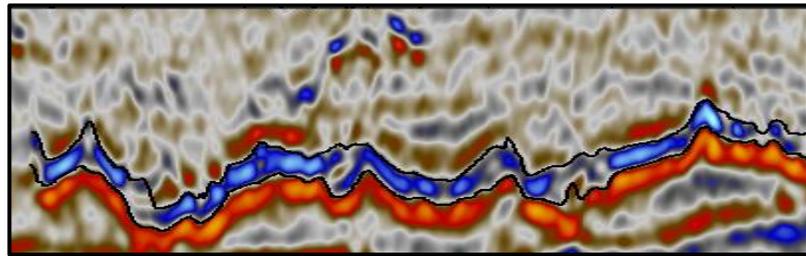


# The Catcher area fields

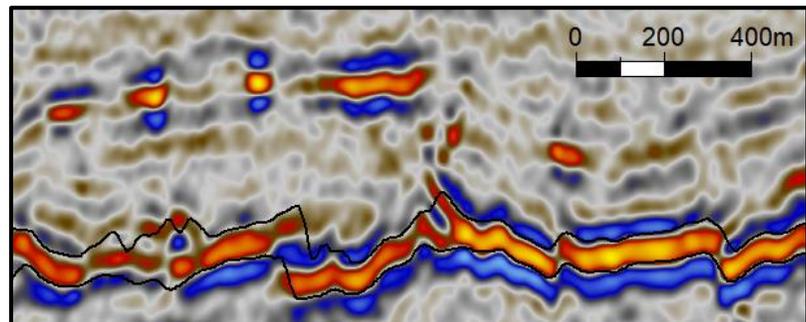
Catcher



Varadero

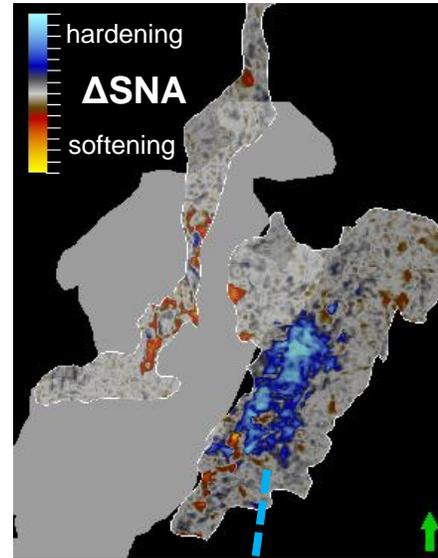


Burgman

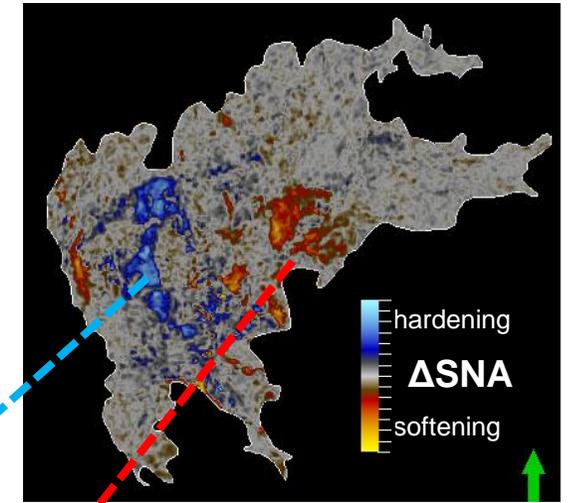


Baseline Quadrature

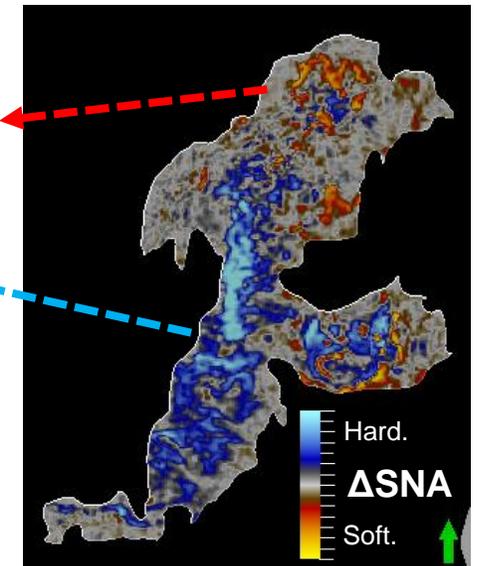
Catcher



Burgman



Varadero



Water injection  
(hardening)

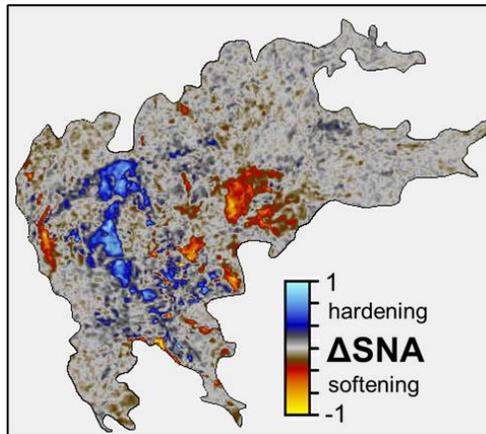
Gas injection  
(softening)

No clear pressure signal

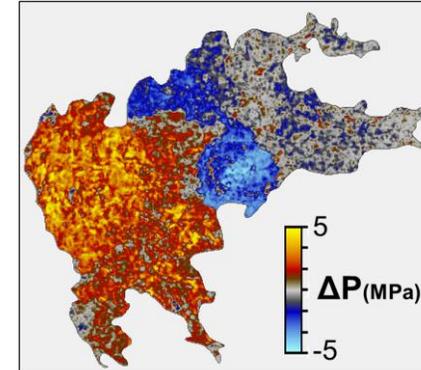
4D amplitude maps

# Objective

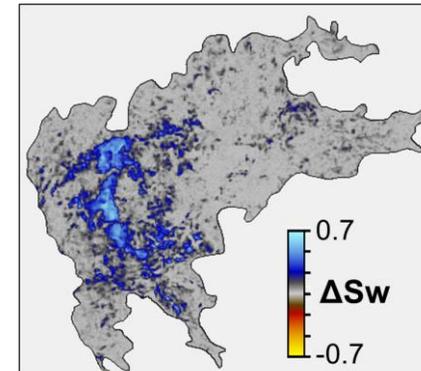
## 4D seismic amplitudes



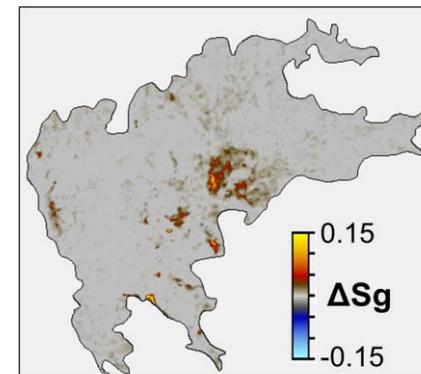
## Reservoir property changes



- Pressure



- Water saturation



- Gas saturation

# Petro-elastic model calibration

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Hamed Amini and Colin MacBeth (2015)  
“Calibration of rock stress-sensitivity using 4D seismic data.”  
77th EAGE conference & exhibition, Madrid, Spain.

Hamed Amini (2018a)  
“Calibration of minerals’ and dry rock elastic moduli in sand-shale mixtures.”  
80th EAGE conference & exhibition, Copenhagen, Denmark.

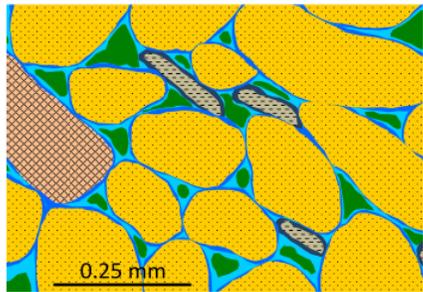
# Petro-elastic model (PEM)

Static model calibrated with:

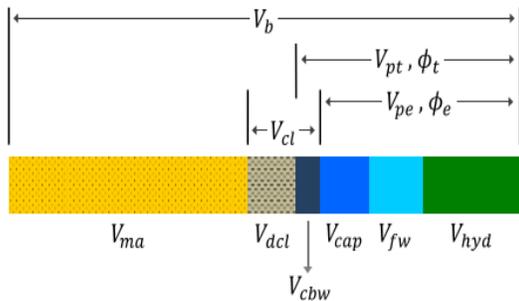
- well log data

1) Mineral and Fluid elastic properties

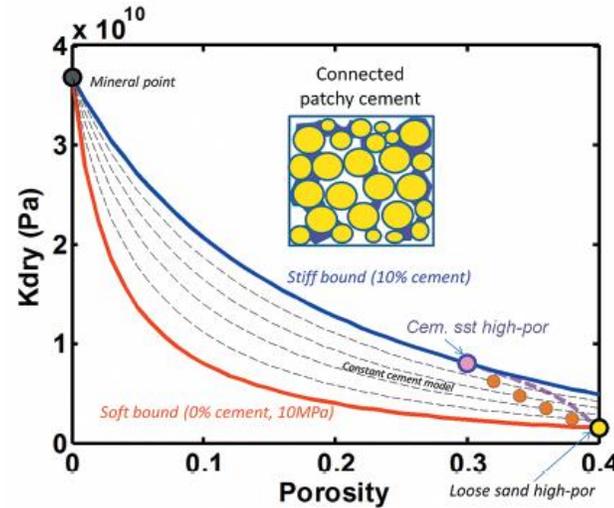
2) Mixing laws



- Matrix
- Clay
- Clay-bound water
- Capillary-bound water
- Free water
- Hydrocarbon



3) Porosity dependence (Dry frame moduli)

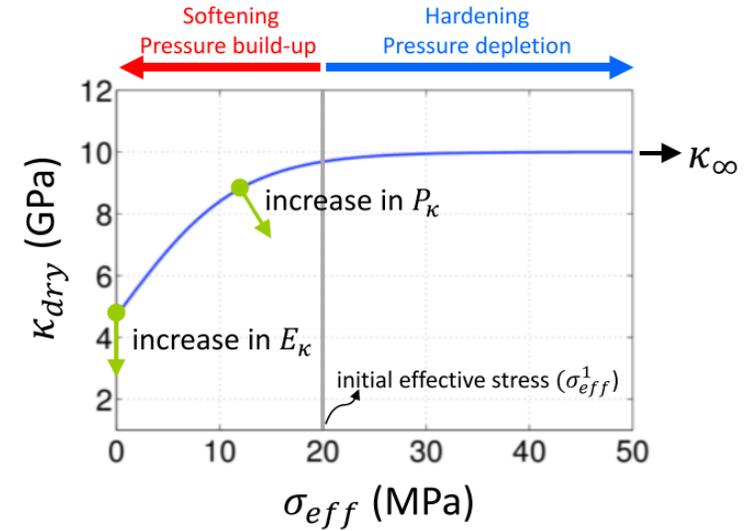


- Nur's Critical Porosity
- Krief
- Cemented sand
- Soft sand
- Xu-White

Dynamic model calibrated with:

- Lab data (core plugs)
- 4D Time-shift data

4) Pressure sensitivity



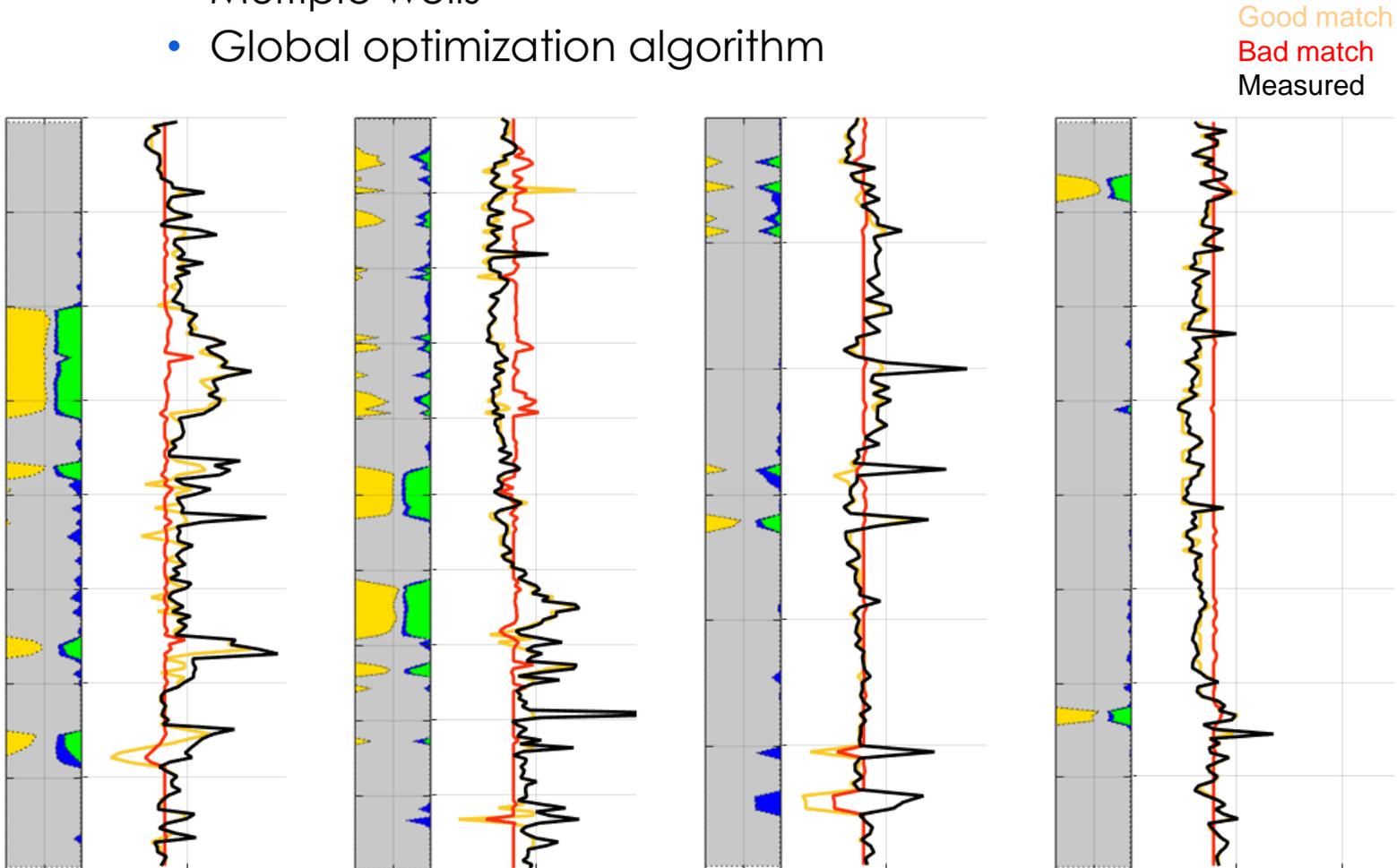
- MacBeth (2004) equations

# Static model calibration

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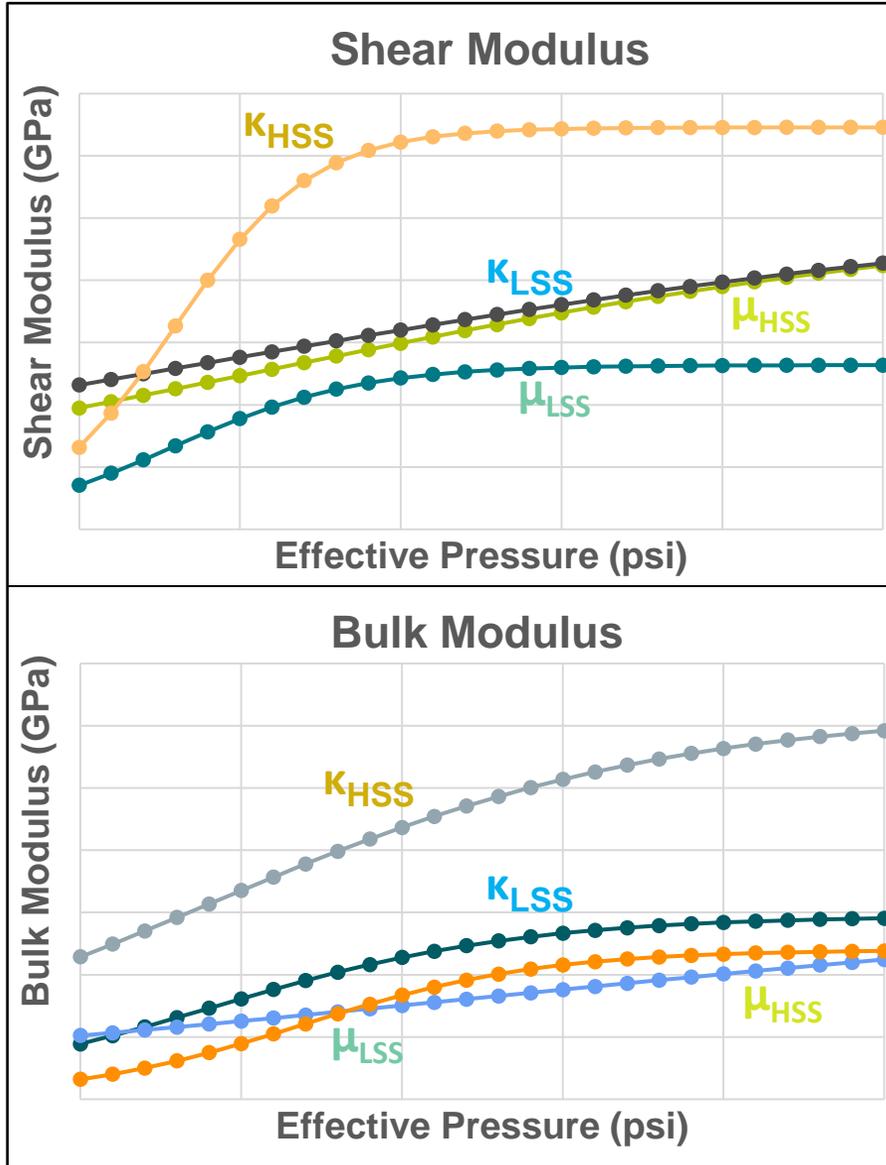
Well log data:

- Density, Vp and Vs
- Multiple wells
- Global optimization algorithm

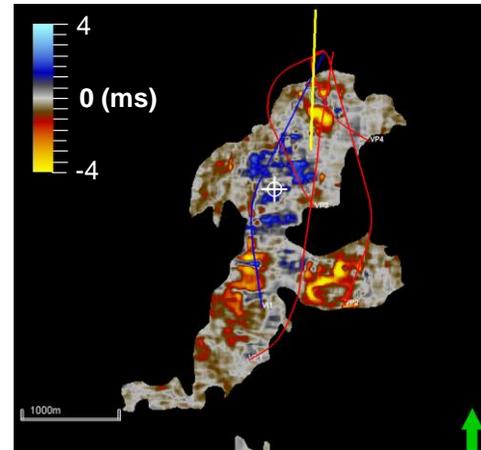


# Dynamic model calibration

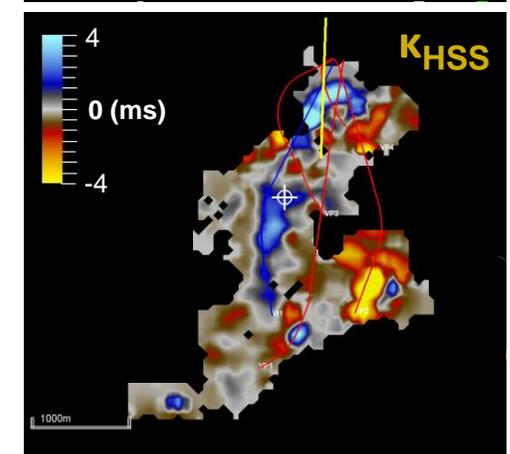
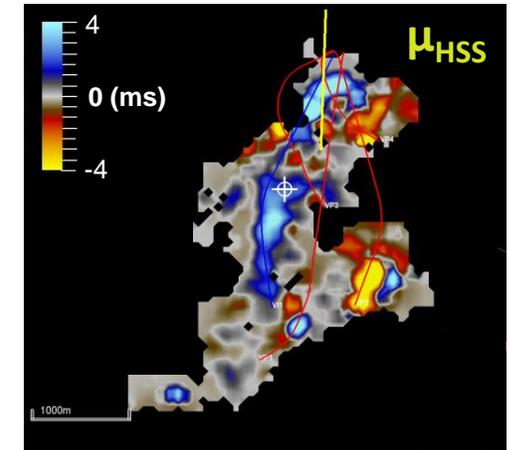
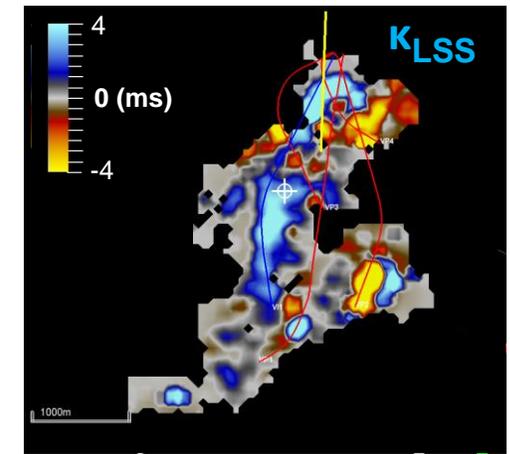
## Core plug laboratory data



## Time-Lapse Time-Shifts



Observed



Modelled

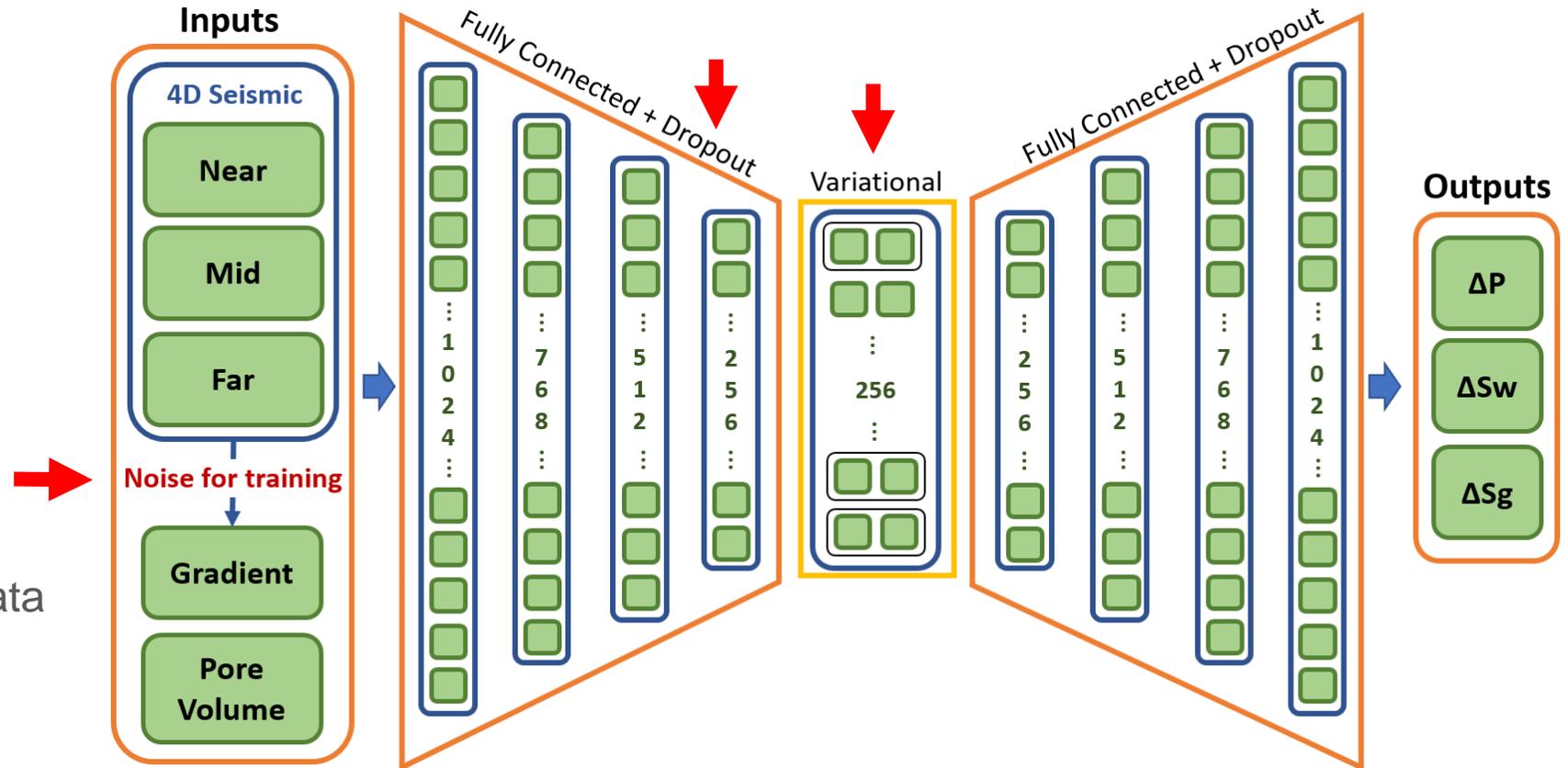
# Deep Neural Network (DNN) inversion

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Gustavo Côrte, Jesper Dramsch, Hamed Amini, and Colin MacBeth (2020),  
“Deep neural network application for 4D seismic inversion to changes in pressure and saturation:  
Optimizing the use of synthetic training datasets”.  
*Geophysical Prospecting*, 68: 2164-2185.

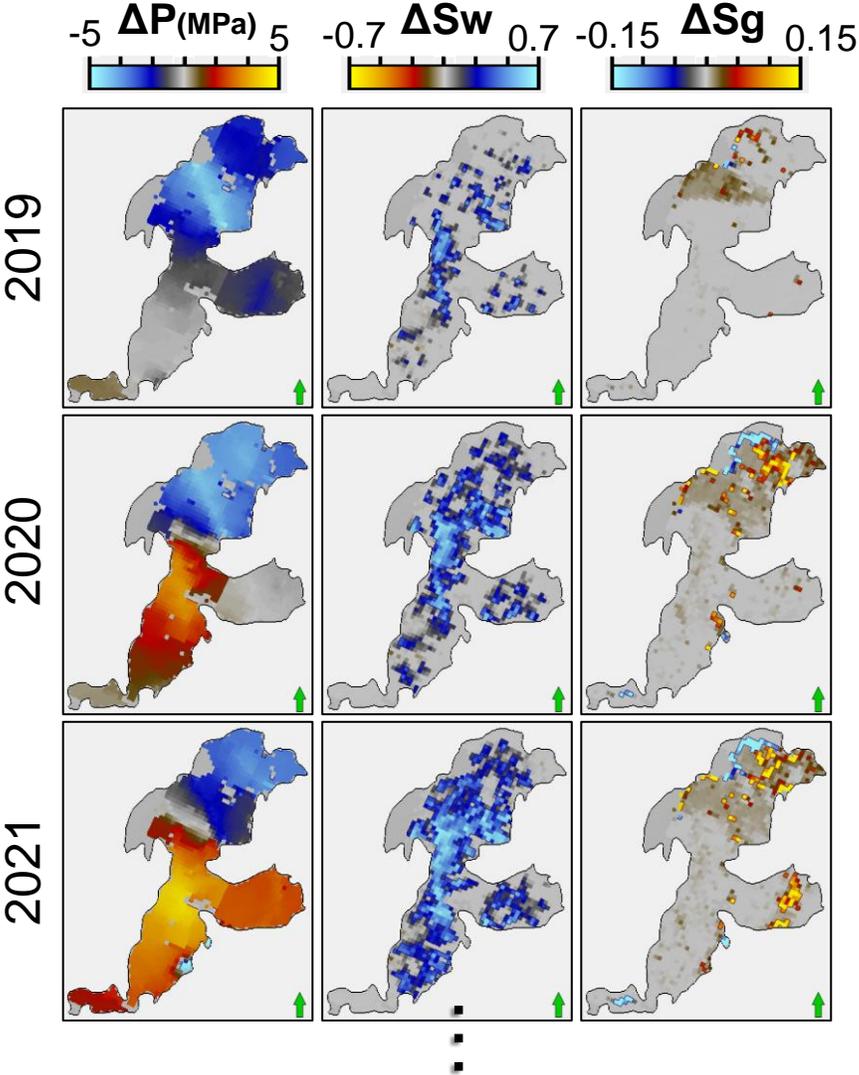
# DNN Architecture

- Variational Auto-Encoder
- Pixel by Pixel inversion
  - No lateral correlation constraints
- Regularization ←
  - Variational central layer
  - Dropout regularization
  - Train with noisy synthetic data

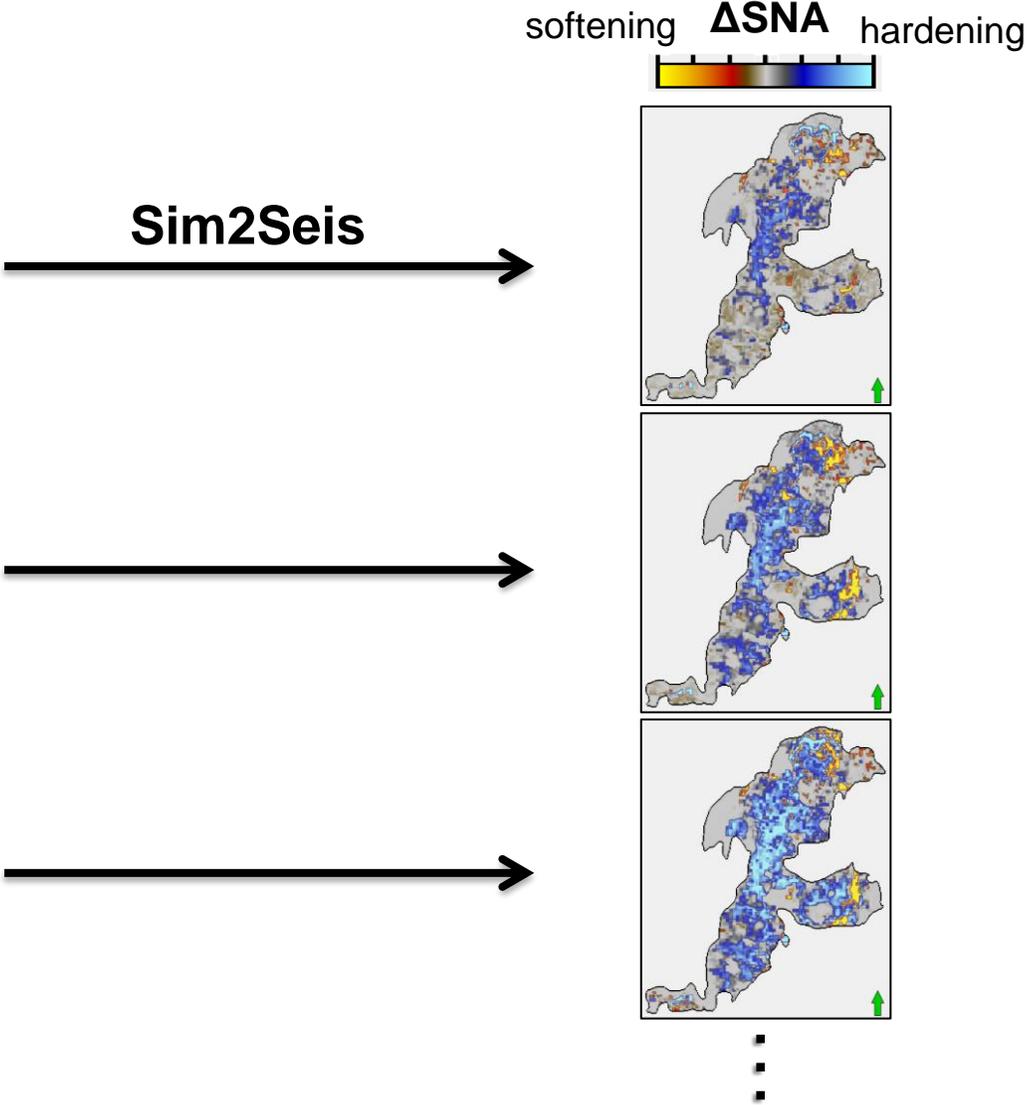


# Synthetic training dataset

- Reservoir simulation results
  - 15 time-steps

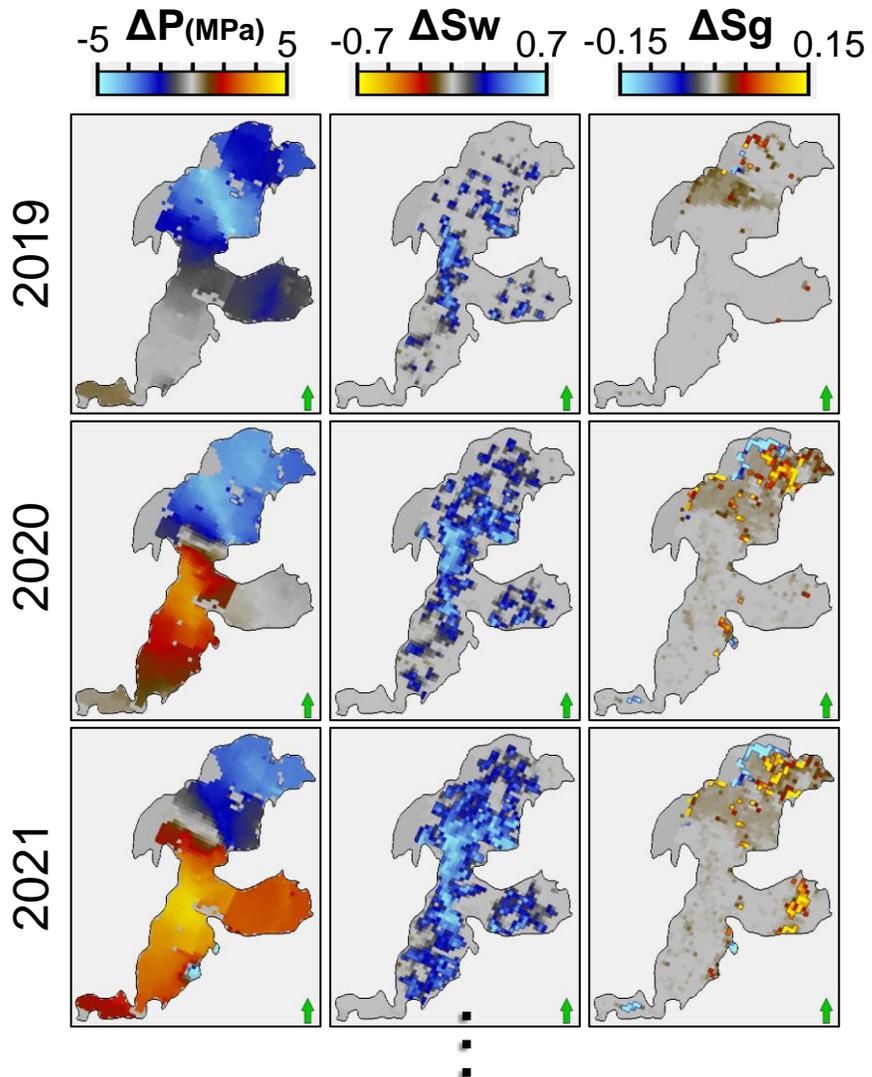


- Synthetic 4D seismic maps

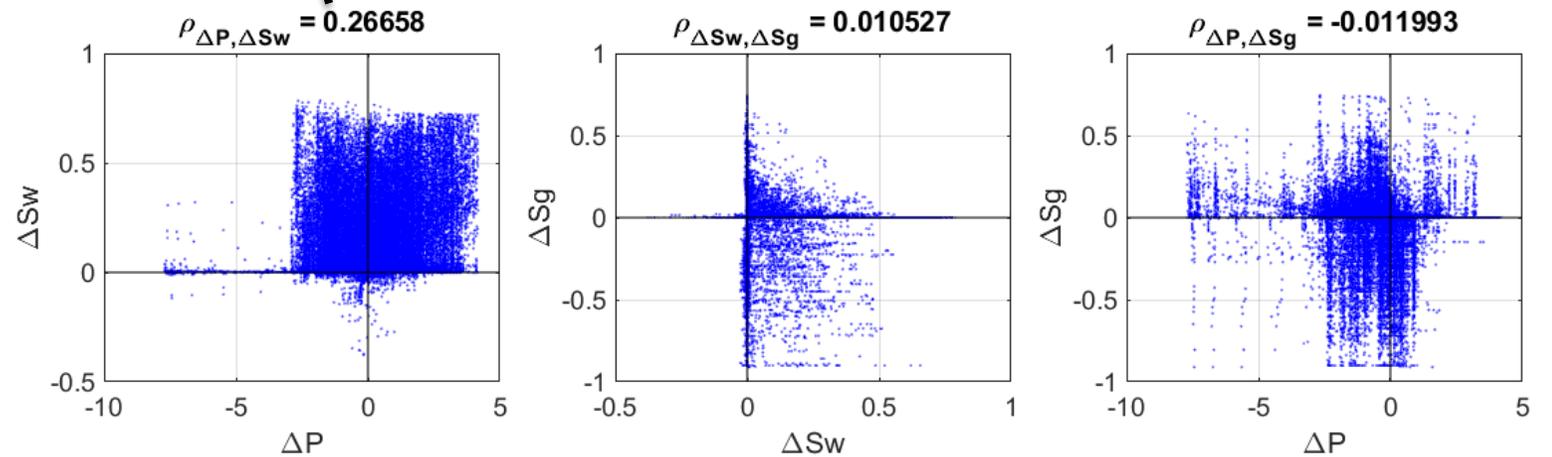


# Synthetic training dataset

- Reservoir simulation results
  - 15 time-steps



- Pressure increase always related to water injection
- Statistical correlation between:  
Pressure increase ↔ Water saturation increase



# DNN Inversion results

Training data property correlation

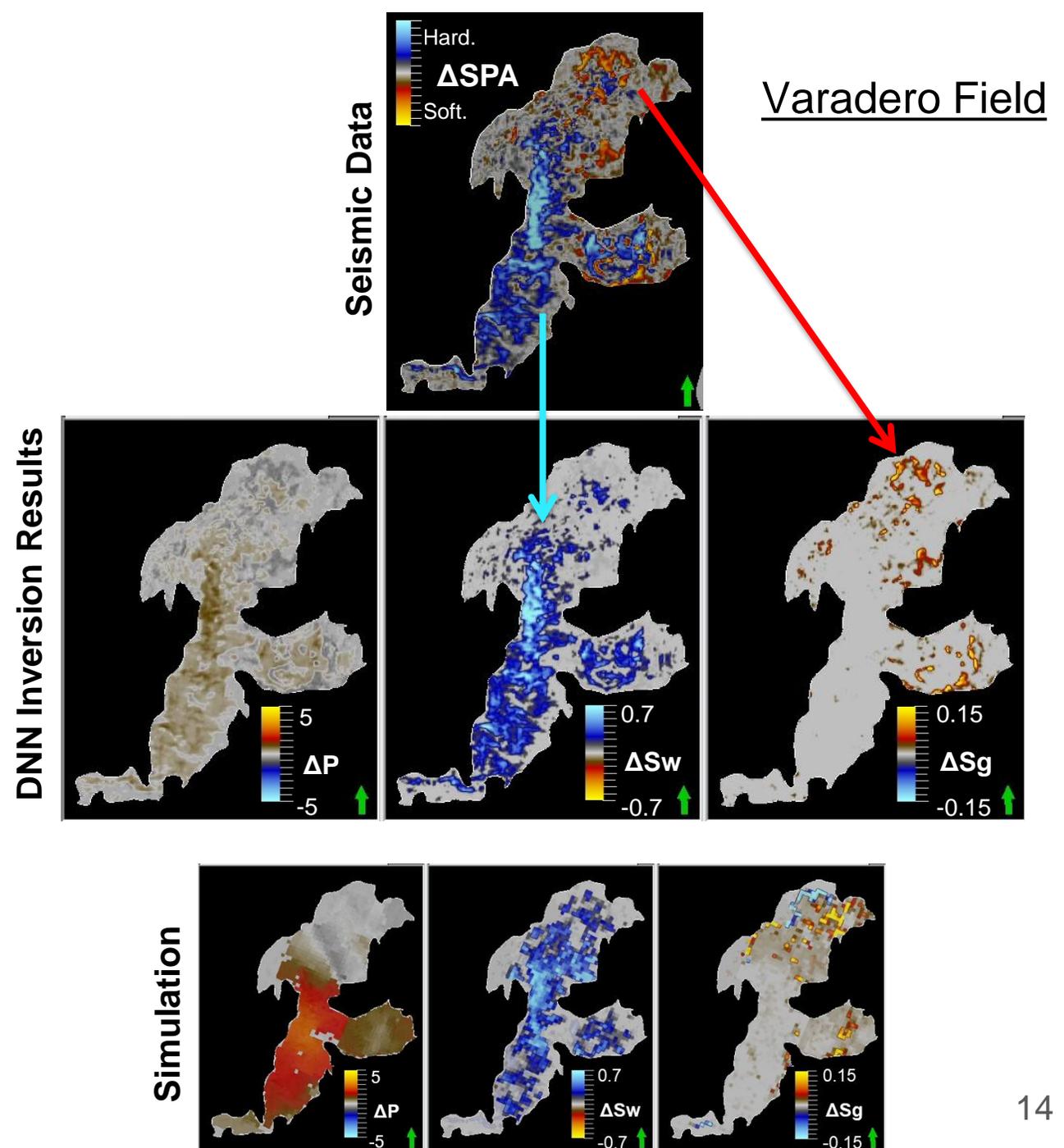
Water injection



Pressure increase

## Pressure Results

Pressure increase in hardening signal regions



# DNN Inversion results

Burgman Field

Training data property correlation

Water injection

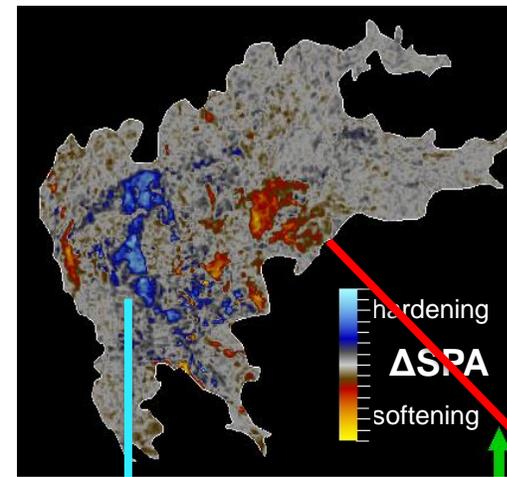


Pressure increase

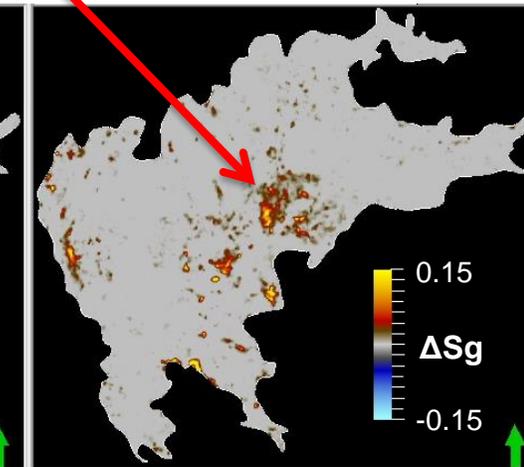
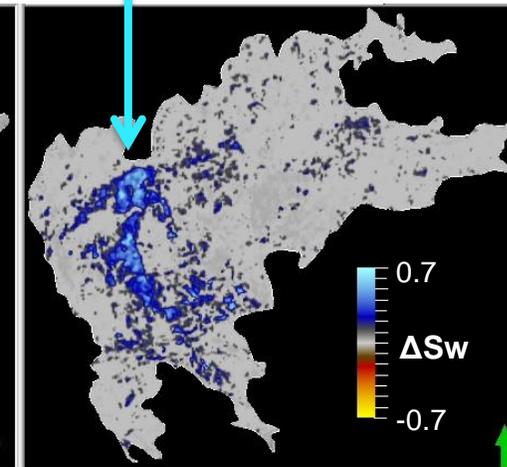
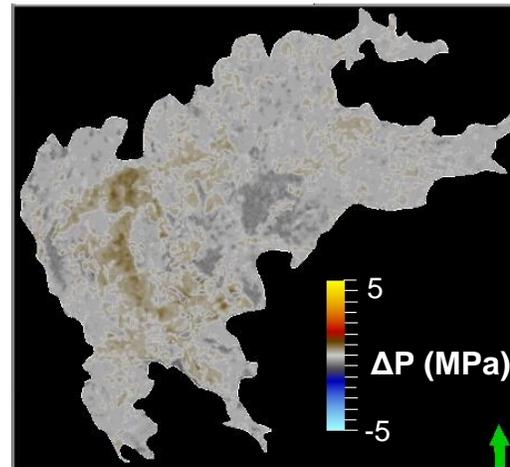
Pressure Results

Pressure increase in hardening signal regions

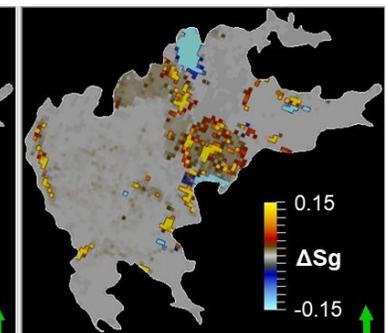
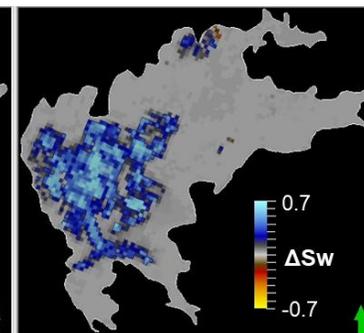
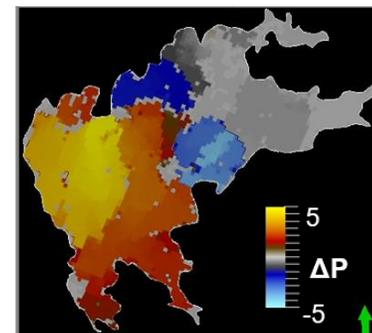
Seismic Data



DNN Inversion Results



Simulation



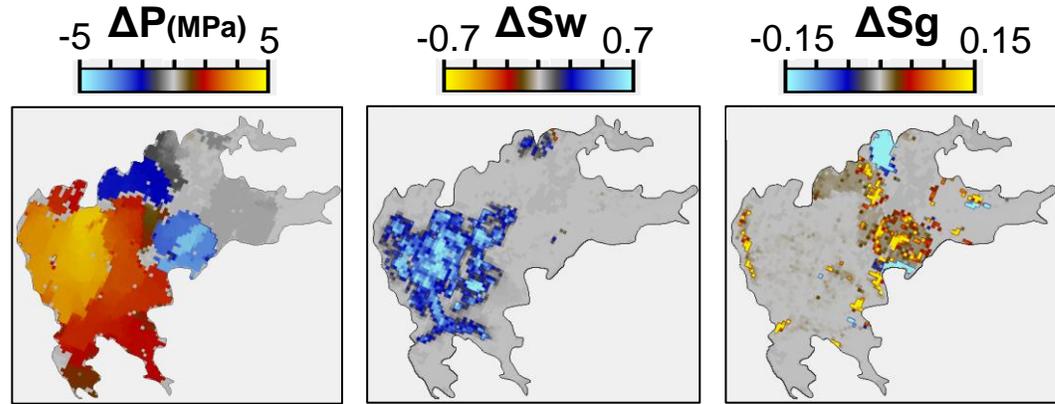
# Bayesian Stochastic Inversion

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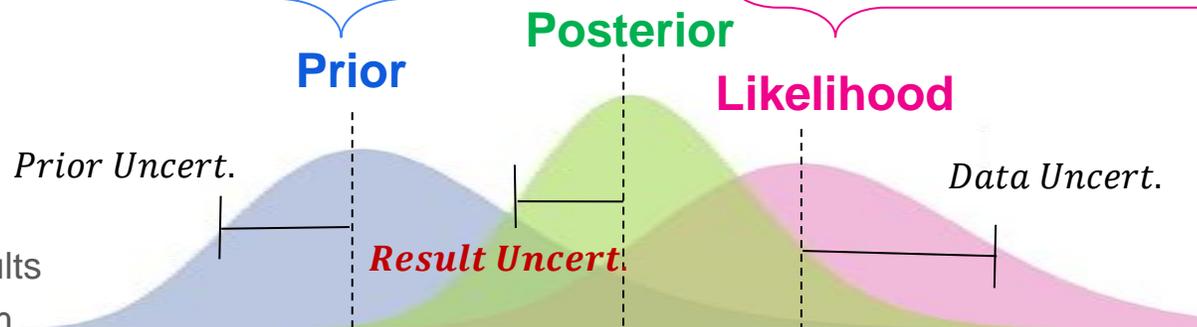
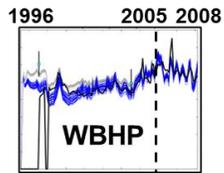
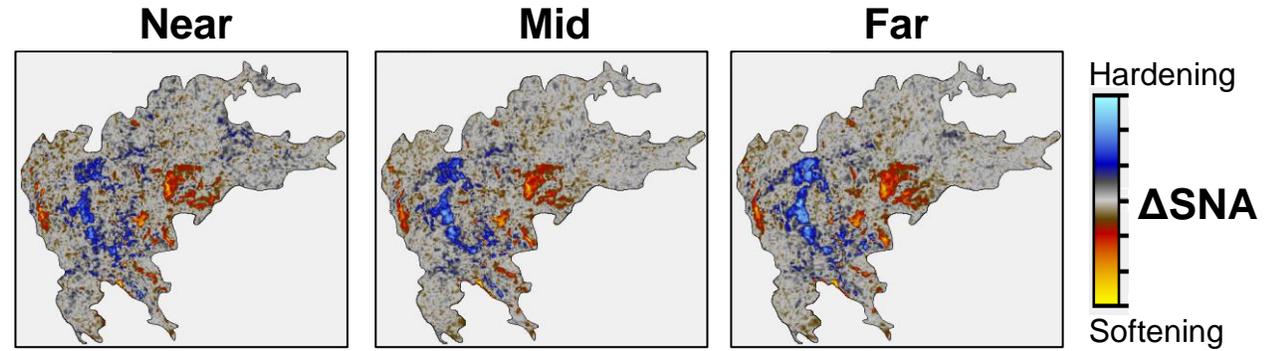
Gustavo Côrte, Hamed Amini, and Colin MacBeth (2023),  
“Bayesian inversion of 4D seismic data to pressure and saturation changes:  
Application to a west of Shetlands field”.  
*Geophysical Prospecting*, 71, 292– 321.

# Bayesian Stochastic Inversion

## Prior Estimation



## 4D Seismic Data



### Prior information

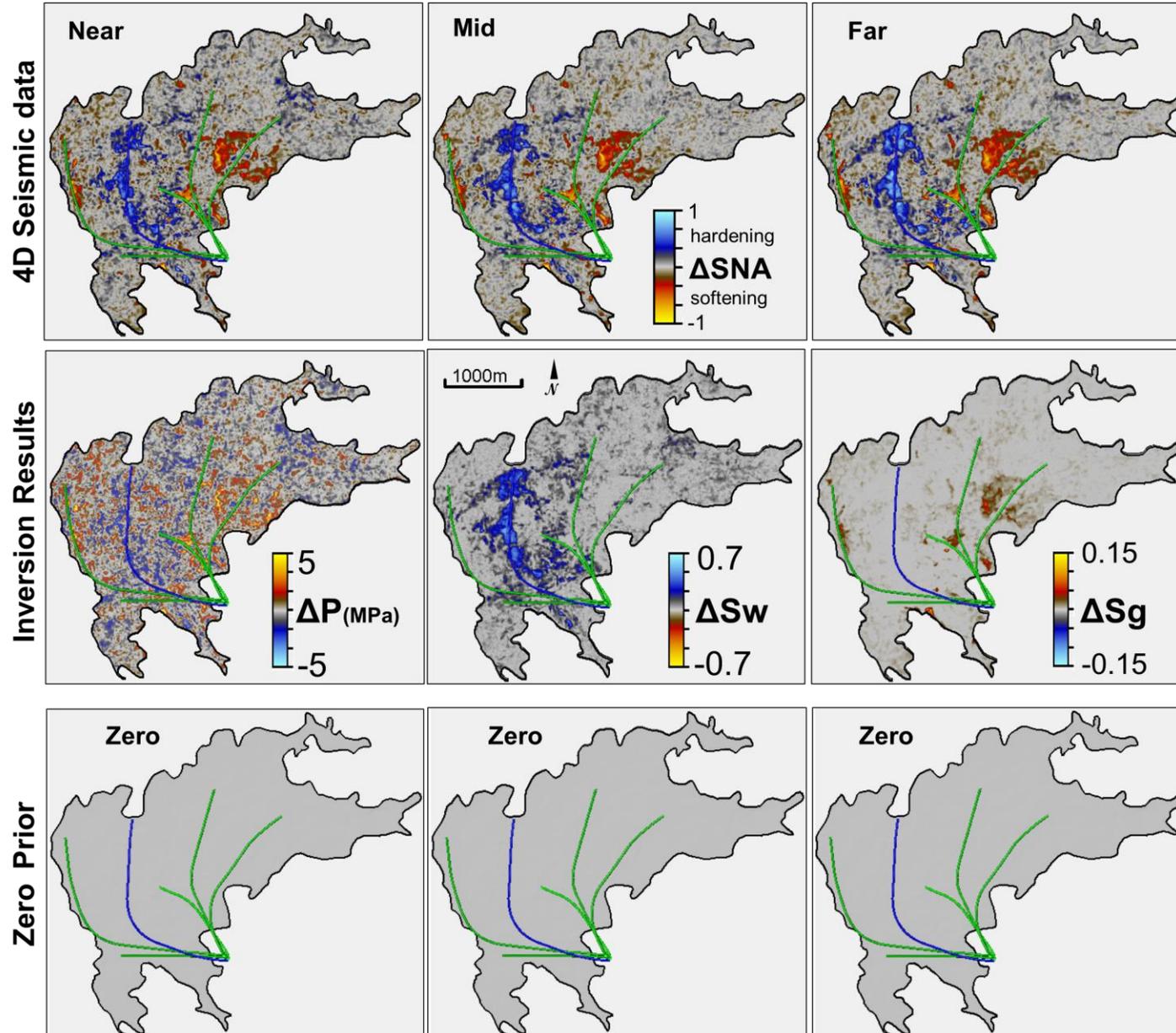
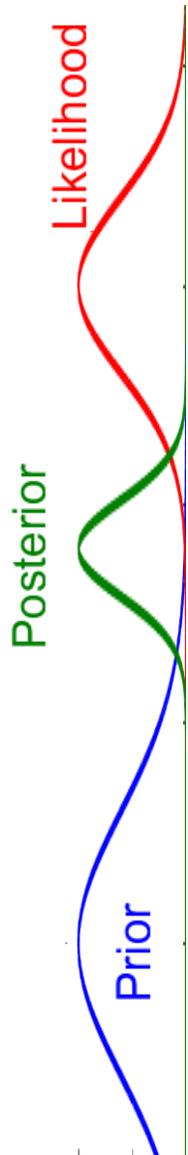
- Reservoir simulation results
- Property correlations from training dataset
- Well pressures (BHP)

- Data correlations from seismic dataset
- 4D seismic uncertainty
  - NRMS

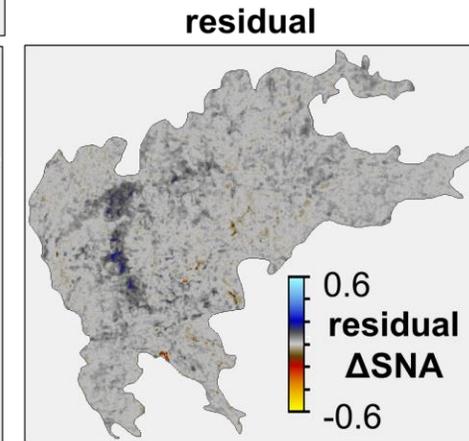
### Final Result

- Stochastic Markov-Chain Monte Carlo

# Bayesian Stochastic Inversion

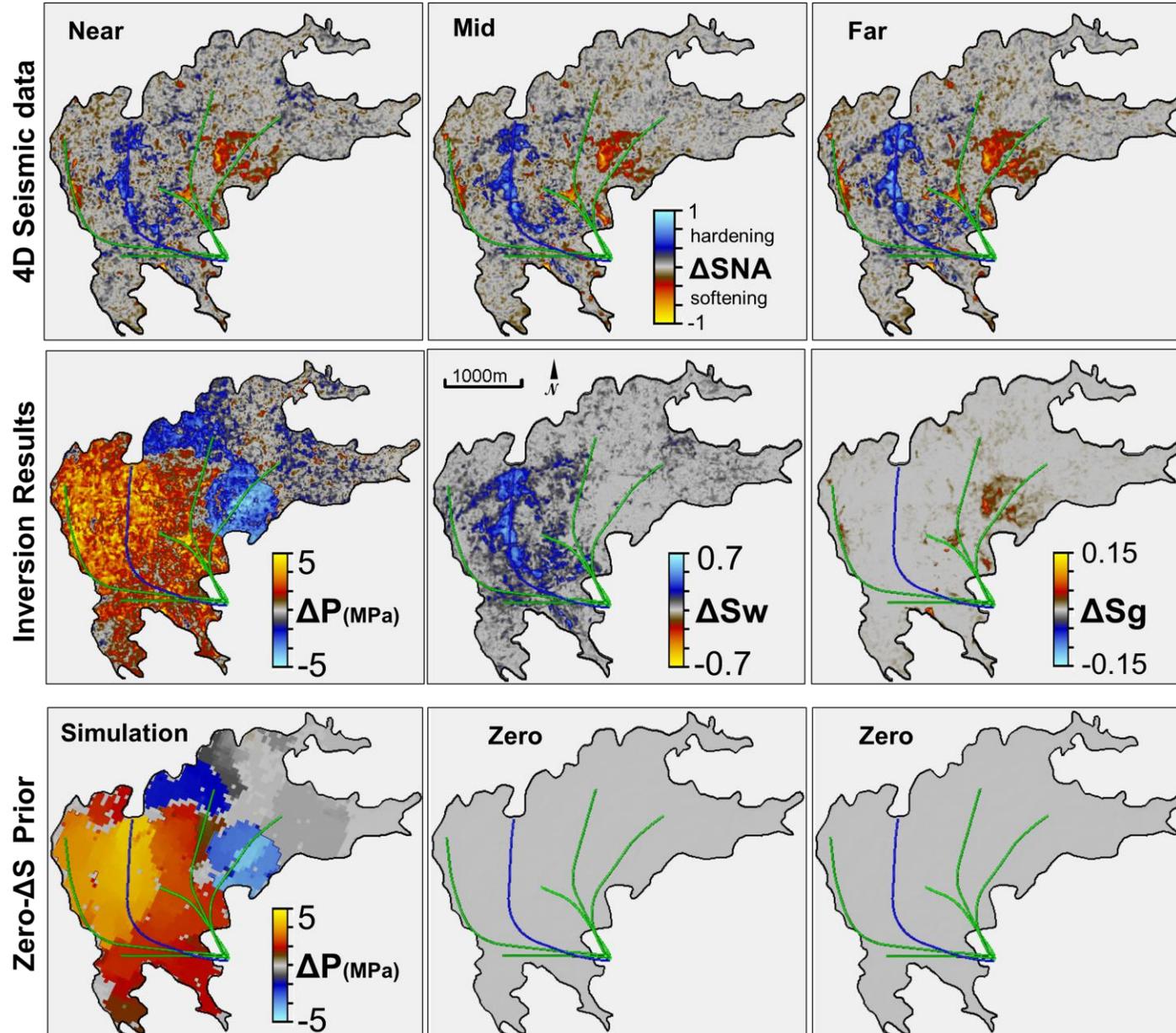
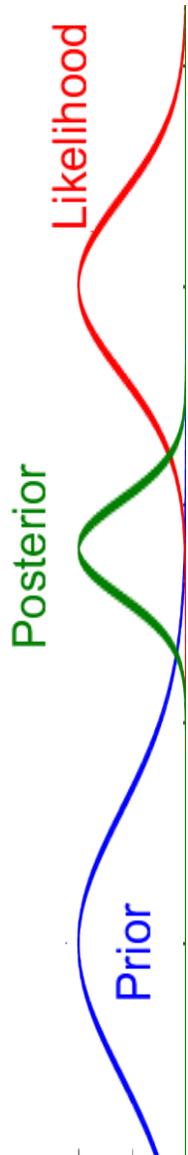


- Pressure results: noise
- Residual hardening

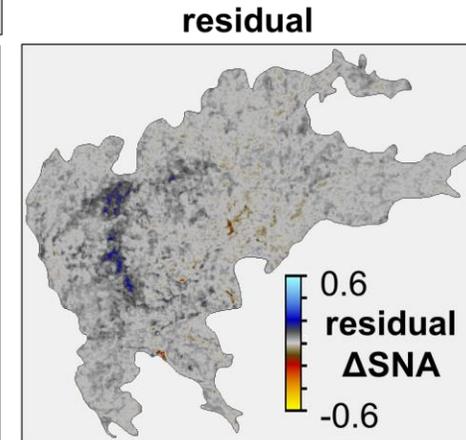


- Prior information
  - No prior information
  - Zero change values everywhere

# Bayesian Stochastic Inversion

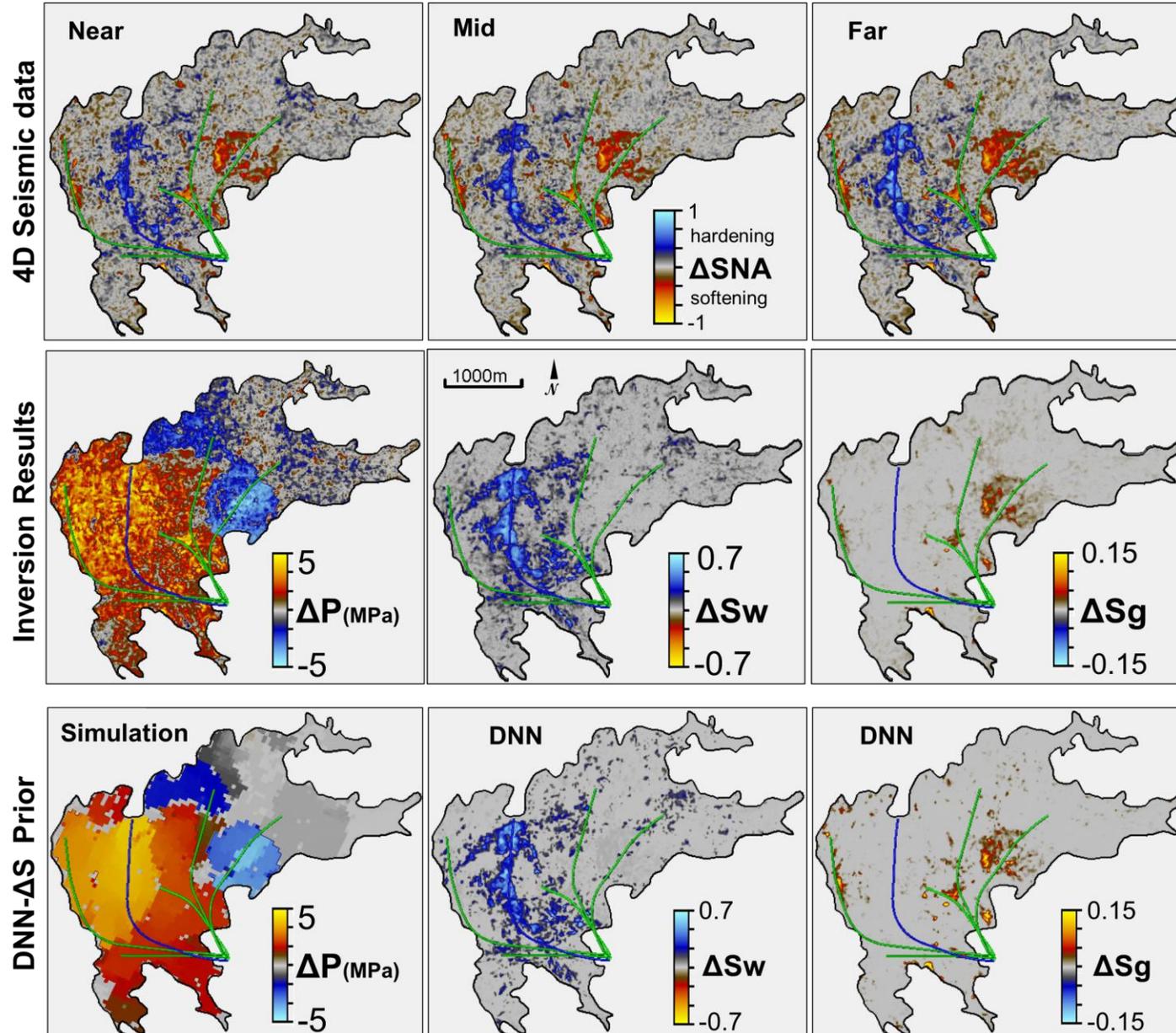
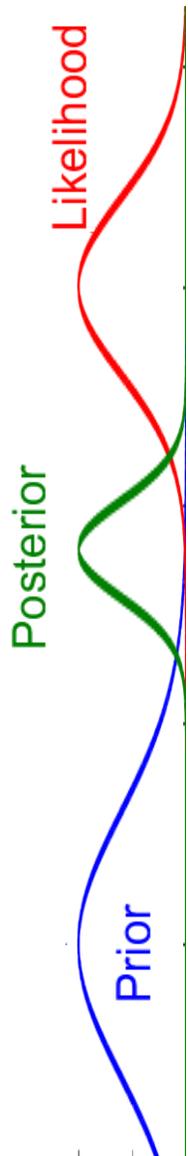


- Pressure results: simulation
- Saturation results: **slightly higher** to compensate for the imposed pressure signal
- Residual hardening

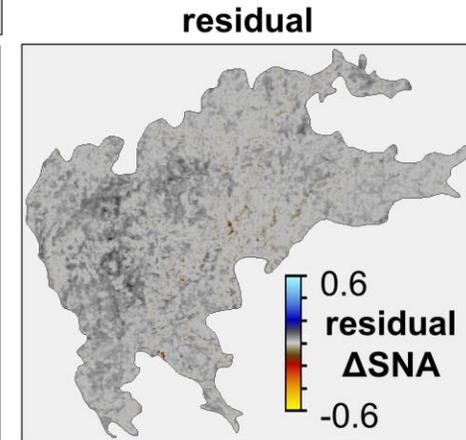


- Prior information
  - Pressure: reservoir simulation
  - Saturation: Zero change values

# Bayesian Stochastic Inversion



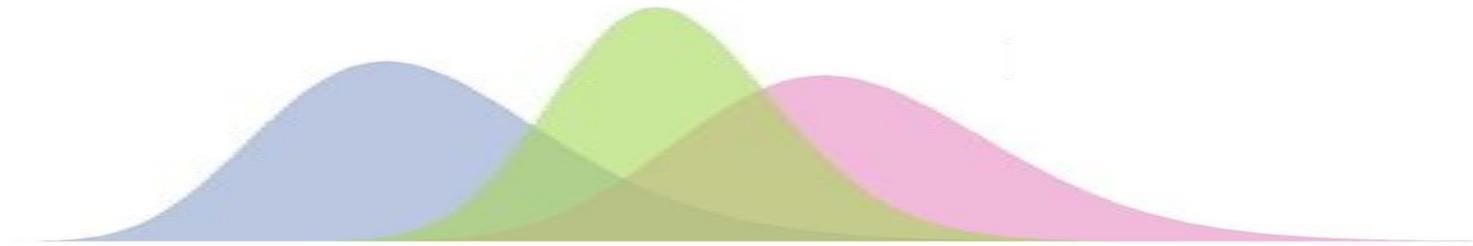
- Pressure results: simulation
- Saturation results: **slightly higher** than previous and also the DNN prior values
- Residual hardening **gone**



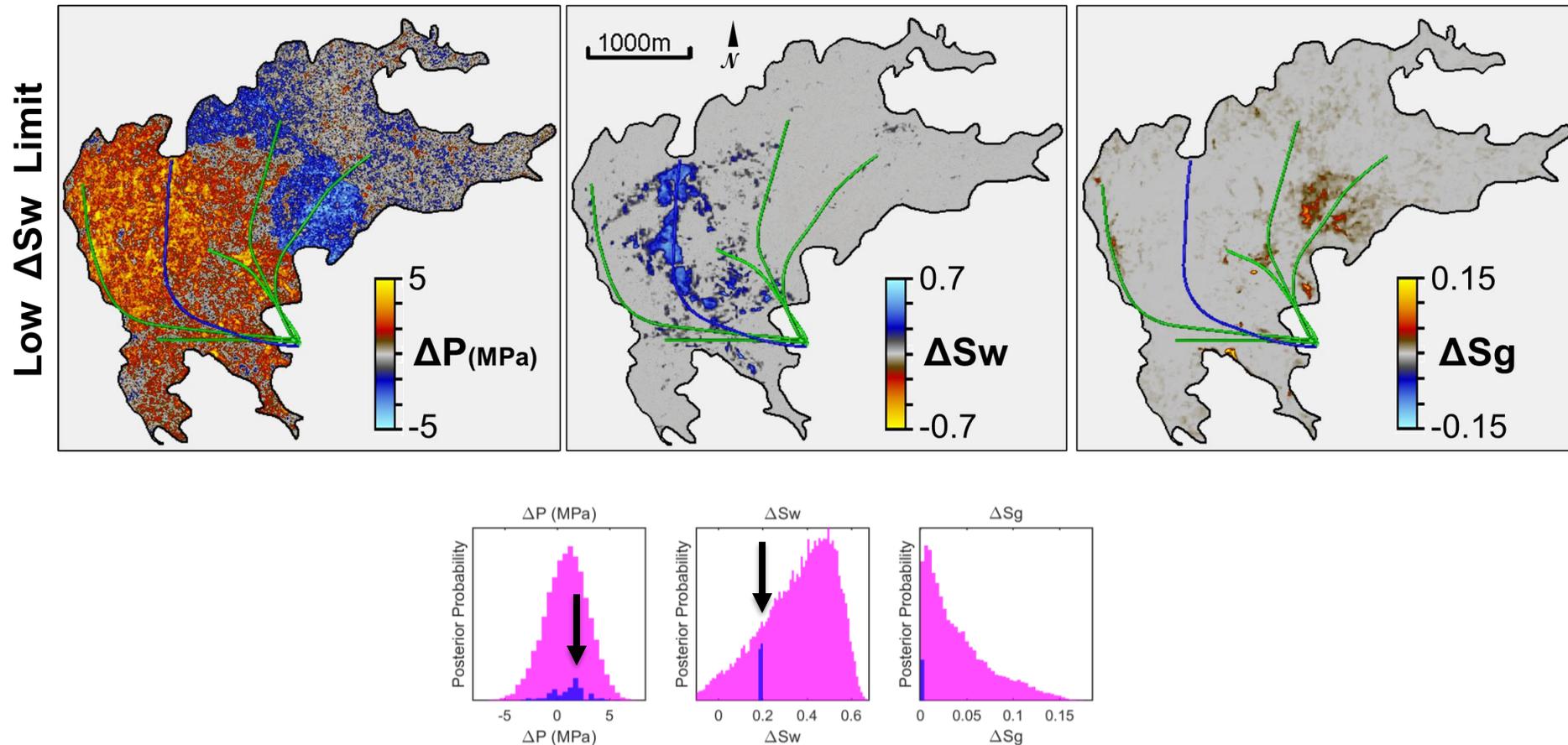
- Prior information
  - Pressure: reservoir simulation
  - Saturation: DNN inversion

# Uncertainty quantification

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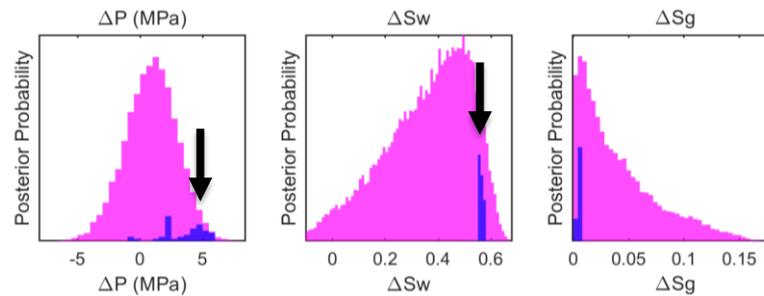
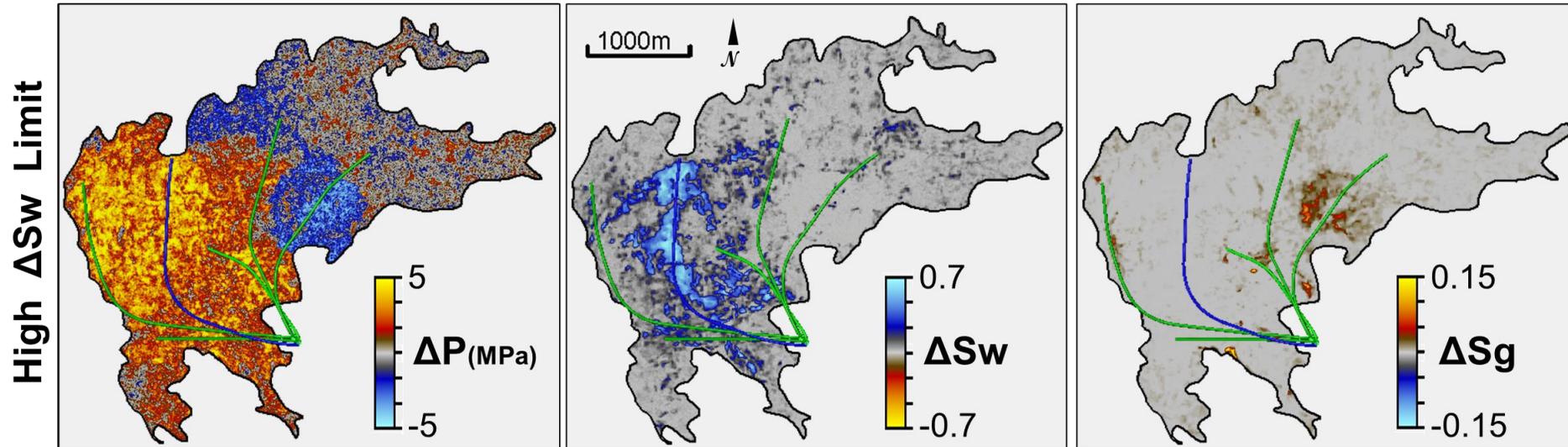


# Uncertainty quantification



- Low water saturations require pressure increases lower than +2 MPa to match seismic data.

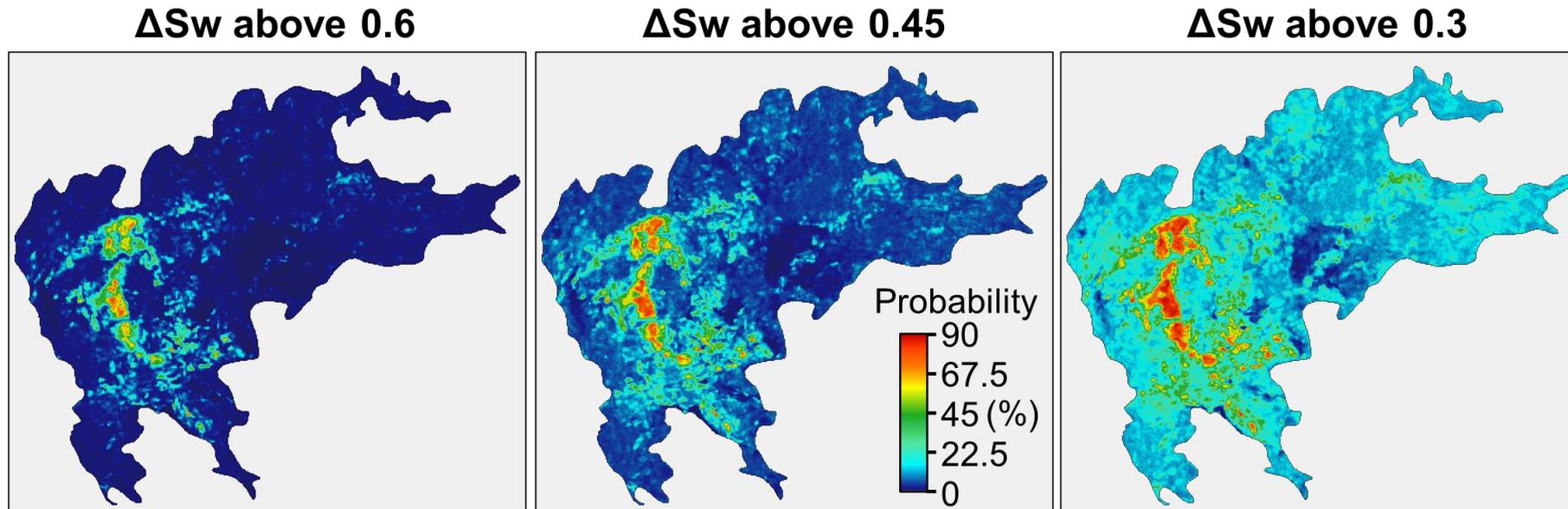
# Uncertainty quantification



- High water saturations require pressure increases as high as +5 MPa to match seismic data.

# Uncertainty quantification

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- Probability of water saturation increase above a certain threshold

# Conclusions

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- **DNN inversion** provides a quick solution
  - Unbiased by prior information such as a reservoir simulation model
  - Incorporates global prior information: property correlations from fluid flow physics
  - Pressure estimations are reasonable, but inaccurate
  - Lack of uncertainty estimation
- **Bayesian inversion** adds to the information content
  - Reservoir simulation pressure prior
    - Likely more accurate than without, but biased by reservoir simulation results
  - DNN saturation prior
    - Better match to the 4D seismic data
  - Uncertainty quantification
    - Multiple realizations that match the 4D seismic data
    - High and low uncertainty bounds
    - P10 and P90 estimations

## Acknowledgements

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- Harbour Energy and Catcher JV partners
- Colin MacBeth  
Hamed Amini  
Jesper Dramsch



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