Joint Utilization of Geophysical Data Types, with Application to Monitoring of CO_2 Injection in the Skade Formation

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Large-scale CO_2 Sequestration

Rationale for geophysical monitoring

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Rationale for geophysical monitoring

About 12 Gt CO_2 must be stored before 2050 to meet European targets

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Subsurface formation must have sufficient storage capacity

Large-scale CO_2 Sequestration Rationale for geophysical monitoring

About 12 Gt CO_2 must be stored before 2050 to meet European targets

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 CO_2 injection will likely be performed with few wells

Large-scale CO_2 Sequestration Rationale for geophysical monitoring

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 $\rightarrow~$ High injection rates must be expected

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Subsurface formation must have sufficient storage capacity

 CO_2 injection will likely be performed with few wells

- $\rightarrow~$ High injection rates must be expected
- $\rightarrow~$ Assess pressure increase, in addition to ${\rm CO}_2$ plume placement

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Forward and Inverse Modelling Study



Thickness map

Storage capacity: 15 Gt

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Forward and Inverse Modelling Study Skade formation



Forward: Simulate 50 years of CO_2 injection with 'highest safe injection rates' in three wells along East-West cross section in southern part

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Forward and Inverse Modelling Study Skade formation



Thickness map

Storage capacity: 15 Gt

Forward: Simulate 50 years of CO_2 injection with 'highest safe injection rates' in three wells along East-West cross section in southern part

Inverse: Detect effects of simulated saturation and pressure changes by geophysical monitoring with various data types

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Forward Modelling Study

Results along cross section intersecting the wells



 ΔS (CO₂ saturation change)



 ΔP (Pressure change)

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Forward Modelling Study

Results along cross section intersecting the wells



Select region around middle well for Inverse Modelling Study

Forward Modelling Study

Results along cross section intersecting the wells - around middle well

0.0







 ΔS

25 30

x (km)

1150

15 20

 ΔP



Seismic survey

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Data \rightarrow velocity

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$$d_s \rightarrow V$$

Seismic survey



 $egin{array}{rcl} {\sf Data} & o & {\sf velocity} \ d_{s} & o & V(\Delta S, \Delta P) \end{array}$

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Seismic survey

 $V(\Delta S, \Delta P) = V_0(1 - k\Delta S - I\Delta P - m(\Delta P)^2)$ (Landrø 2001)

(We assume that V_0 is known)



Seismic survey

 $egin{array}{rcl} {\sf Data} & o & {\sf velocity} \ d_{\sf s} & o & V(\Delta S, \Delta P) \end{array}$

Aim to estimate $V(\Delta S, \Delta P)$. Will not attempt to estimate ΔS and/or ΔP

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(We assume that V_0 is known)

Seismic Velocity Dependence on ΔS and ΔP (and V_0)



 ΔS







 ΔP



Simulated $V(\Delta S, \Delta P)$

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Assimilation Results for V

Seismic data



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Assimilation Results for V

Seismic data



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Assimilation Results for V

Seismic data



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Seismic, gravimetric and electromagnetic

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Seismic: $d_s \rightarrow V(\Delta S, \Delta P)$

Seismic, gravimetric and electromagnetic

Seismic: $d_s \rightarrow V(\Delta S, \Delta P)$

Gravimetric:

Gravimetric Data

Acquisition – overview



Acquisition – detail



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Gravimetric Data

Acquisition - overview



Acquisition - detail



Brine-saturated subsurface



$\mathrm{CO}_2\text{-saturated}$ subsurface



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Seismic, gravimetric and electromagnetic

Seismic: $d_s \rightarrow V(\Delta S, \Delta P)$

Gravimetric: $d_g \rightarrow
ho(\Delta S, \Delta P)$

(ρ : density)

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Electromagnetic:

Electromagnetic Data

Acquisition – overview



Acquisition - receiver



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Seismic, gravimetric and electromagnetic

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 \rightarrow Utilize results from assimilation of electromagnetic or gravimetric data to improve prior model for V in inversion of seismic data

Example with electromagnetics and seismics



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Example with electromagnetics and seismics



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Example with electromagnetics and seismics



Example with electromagnetics and seismics



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Example with electromagnetics and seismics





Example with electromagnetics and seismics



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Summary of results for posterior mean of V









Joint Utilization of Electromagnetic and Seismic Data Development of estimate for V



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The true V is characterized by large regions with slow (unknown) variation, sharp boundaries between regions, and unknown region shapes

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A parameterization (very similar to a level set parametrization) facilitating shape estimation and sharp region boundaries, and enforcing slow variation within regions, has therefore been applied

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Part of each state vector, y, will contain parameters, a, controlling region-boundary positions, b; b = f(a).

$$y^T = [a_1 \dots a_A]$$

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Part of each state vector, y, will contain parameters, a, controlling region-boundary positions, b; b = f(a). Other parts will contain parameters controlling spatial variation within each region.

$$y^T = [a_1 \dots a_A | m_1 \dots m_M | q_1 \dots q_Q]$$

Illustration of Parameterization—Prior Model for V

Mean of V, mean of region boundaries, and region-boundaries ensemble



 \overline{b} (black) and $\{b_e\}_{e=1}^E$ (grey)



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Joint Utilization of Electromagnetic and Seismic Data

Development of mean of V, mean of region boundaries, and region-boundaries ensemble

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Joint Utilization of Electromagnetic and Seismic Data

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Joint Utilization of Electromagnetic and Seismic Data

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A methodology for assimilating data obtained from geophysical monitoring of the subsurface, and its application to a modelling study targeting $\rm CO_2$ injection in the Skade formation in the North Sea, have been presented

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Improved estimates of seismic velocity were obtained when electromagnetic or gravimetric data were utilized to improve the prior model for seismic velocity before inversion of the seismic data

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Partial financial support was provided by the SUCCESS project, funded by ConocoPhillips, DEA, DONG, Octio, Statoil, Store Norske Spitsbergen Kullkompani, and the Research Council of Norway (RCN) (Climit). Partial financial support was also provided by the PROTECT project, funded by DEA, Total, and RCN (Climit)