



# Reducing Uncertainties in Model Predictions via History Matching of CO<sub>2</sub> Plume Migration at the Sleipner Project, Norwegian North Sea

Project Number (DE-FE0004381)

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U.S. Department of Energy  
National Energy Technology Laboratory  
Carbon Storage R&D Project Review Meeting  
Developing the Technologies and Building the  
Infrastructure for CCS  
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# Presentation Outline

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- Benefits to the program
- Project overall objectives
- Technical status
- Project summary
- Conclusions and future plans



# Benefit to the Program

- Develop technologies that will support industries' ability to predict CO<sub>2</sub> storage capacity in geologic formations to within  $\pm 30$  percent.
- Develop technologies to demonstrate that 99 percent of injected CO<sub>2</sub> remains in the injection zones.
- This research project applies two multi-phase compositional simulators to the Sleipner Benchmark model for simulating CO<sub>2</sub> plume migration in the uppermost layer (Layer 9) in the Utsira Sand. The Sleipner project in the Norwegian North Sea is the world's first commercial scale geological carbon storage project. 4D seismic data have delineated the CO<sub>2</sub> plume migration history. The relatively long history and high fidelity data make Sleipner one of the best places in the world to conduct multi-phase flow and reactive mass transport modeling of CO<sub>2</sub> migration. This work contributes to the Program's efforts of demonstrating 99% of injected CO<sub>2</sub> remaining in the injected zone and ability to predict storage capacity within  $\pm 30\%$



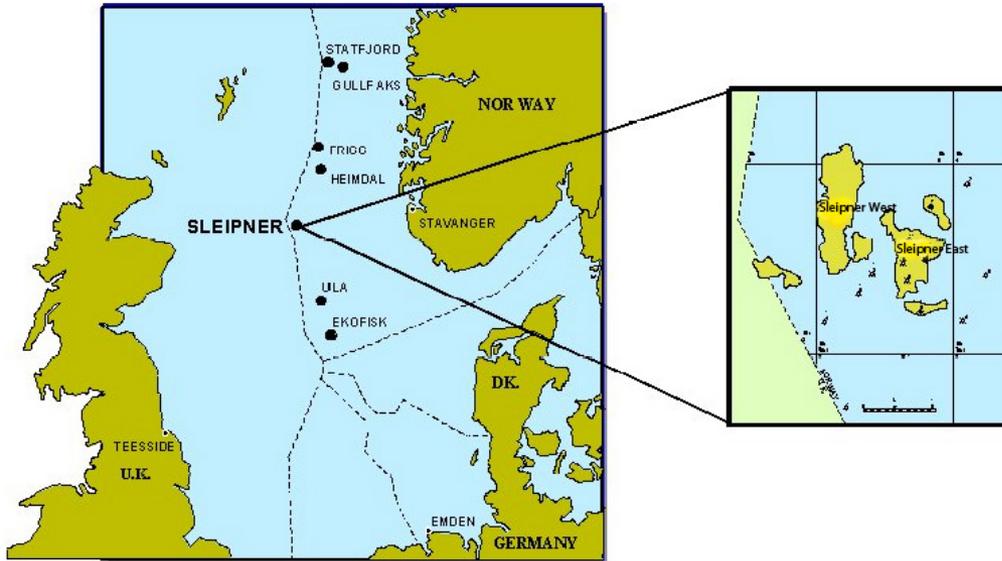
# Project Overview Objectives

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To assess and reduce uncertainties of model predictions of CO<sub>2</sub> plume migration, trapping mechanisms, and storage capacity estimates through history matching, sensitivity analysis, and long-term fate modeling of CO<sub>2</sub> through implementing rigorous chemical kinetics and through a number of bounding calculations and sensitivity analyses

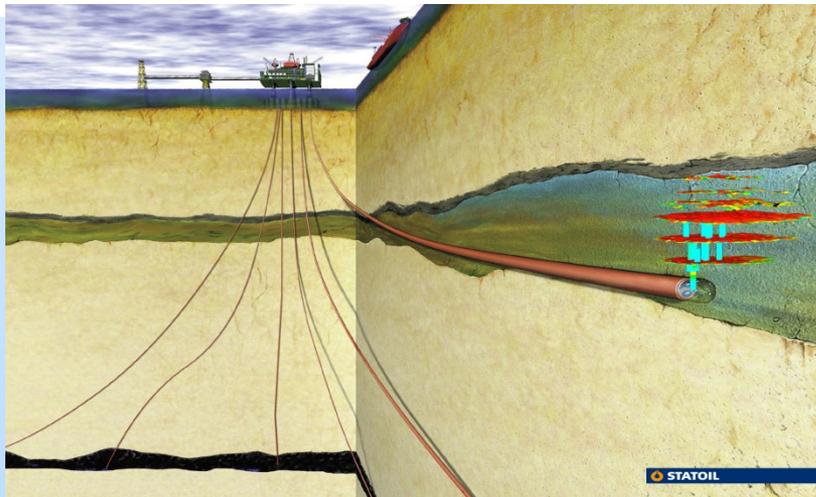


# Norwegian Sleipner Project



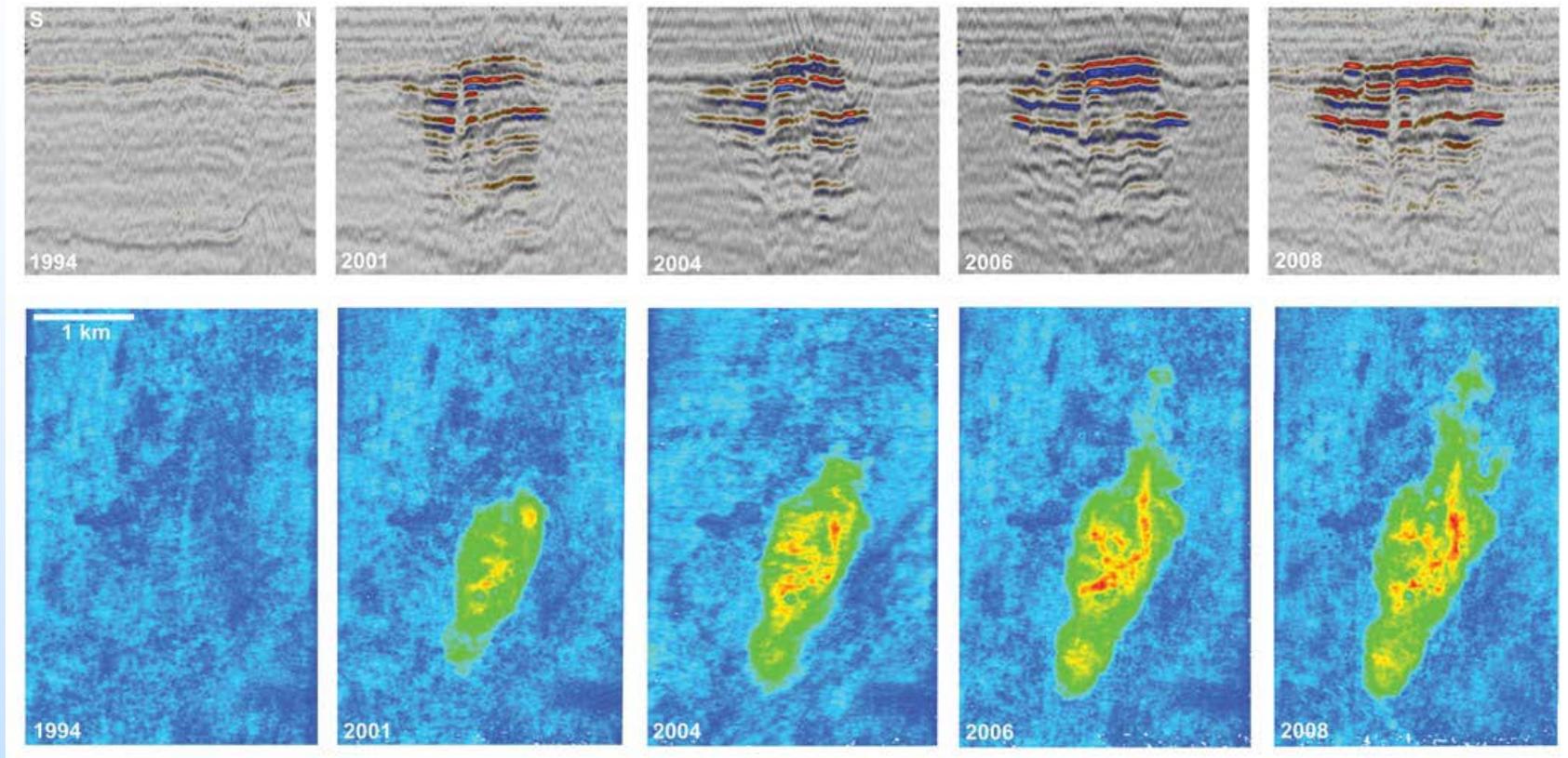
Sleipner CO<sub>2</sub> injection:

- World's first industrial-scale geological carbon storage project
- In operation since 1996
- 1 million ton CO<sub>2</sub>/year
- Storage: Utsira Formation. A saline reservoir 800-1000 meters (2600-3300ft) below the sea floor



# Time-lapse seismic images of the CO<sub>2</sub> plume at Sleipner

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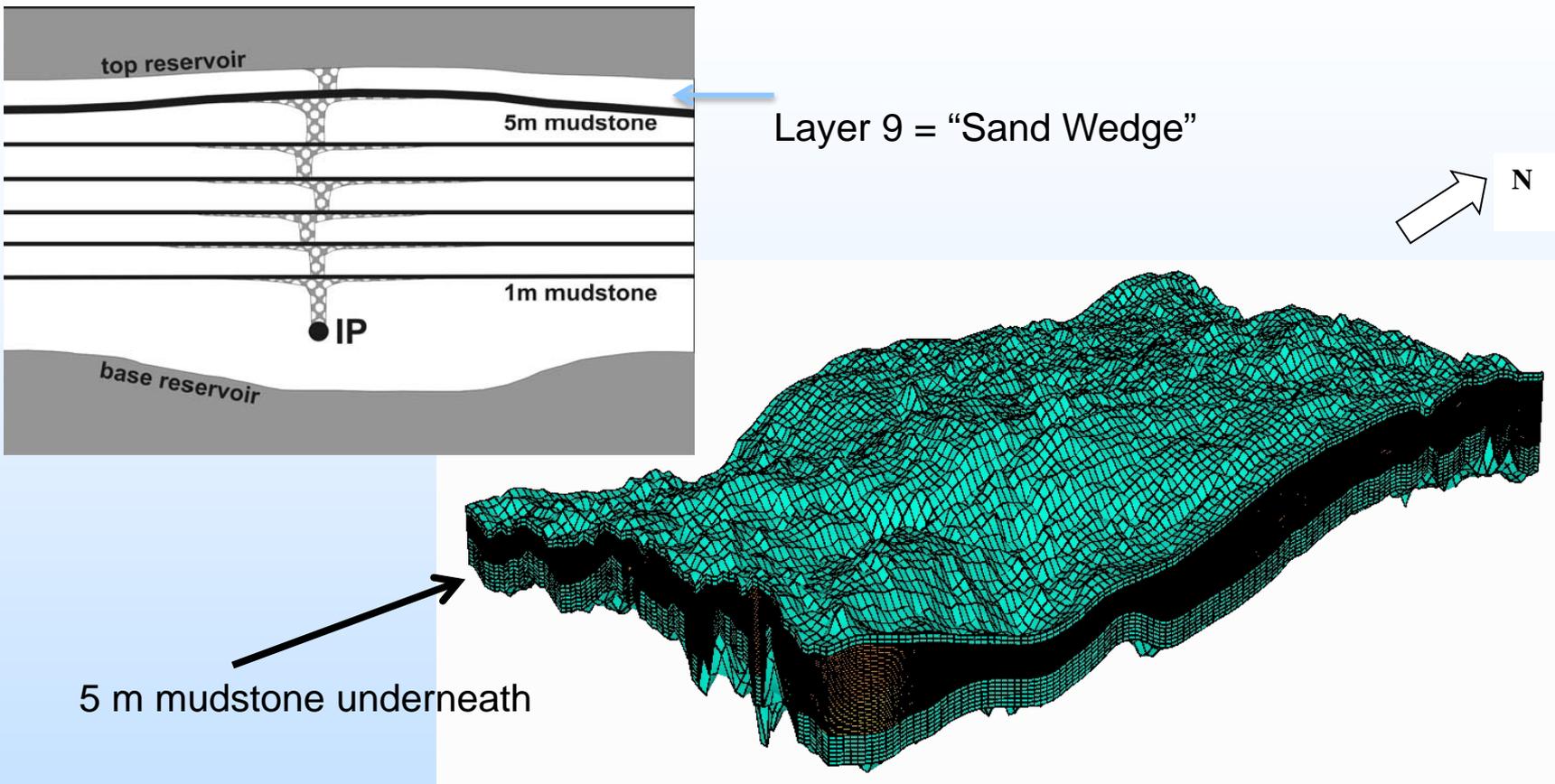


Upper row: N-S seismic section through the plume.

Lower row: plan views of the plume showing total integrated reflection amplitude (Chadwick et al., 2010)



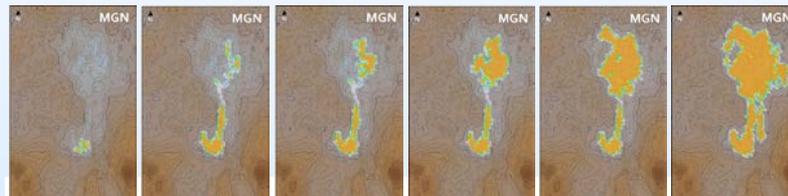
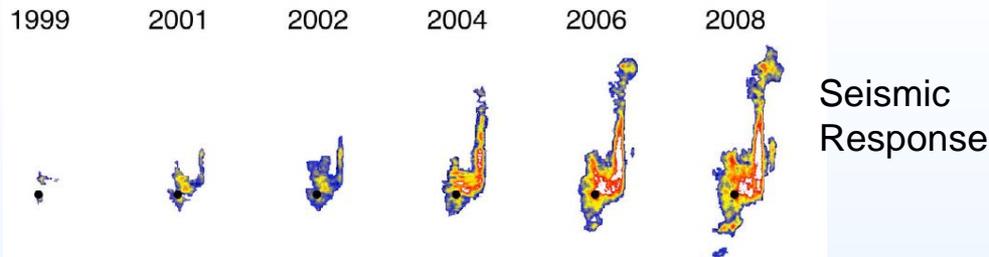
# Statoil-IEA Benchmark Geological Model



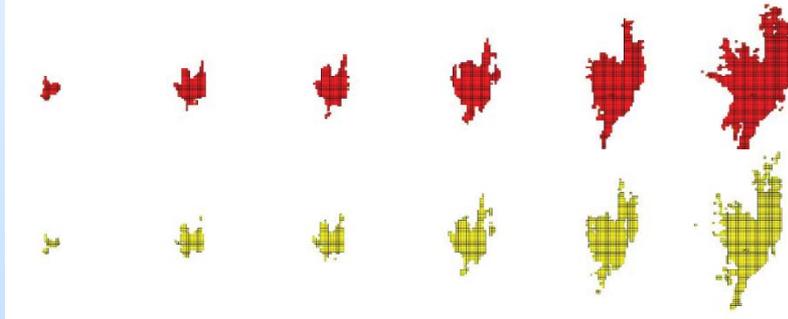
- An area ~ 3 x 6 km
- Grid dimensions: x = 65, y = 119, z = 43; total 332,605 blocks
- The basic grid resolution is 50 m x 50 m.



# Previous modeling work



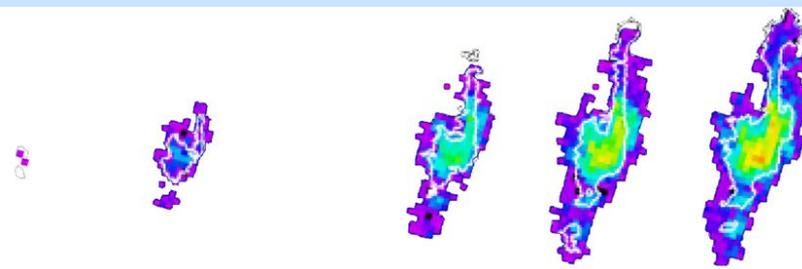
Invasion percolation migration



CO<sub>2</sub> Black Oil Simulator using up-scaled relative permeability curves

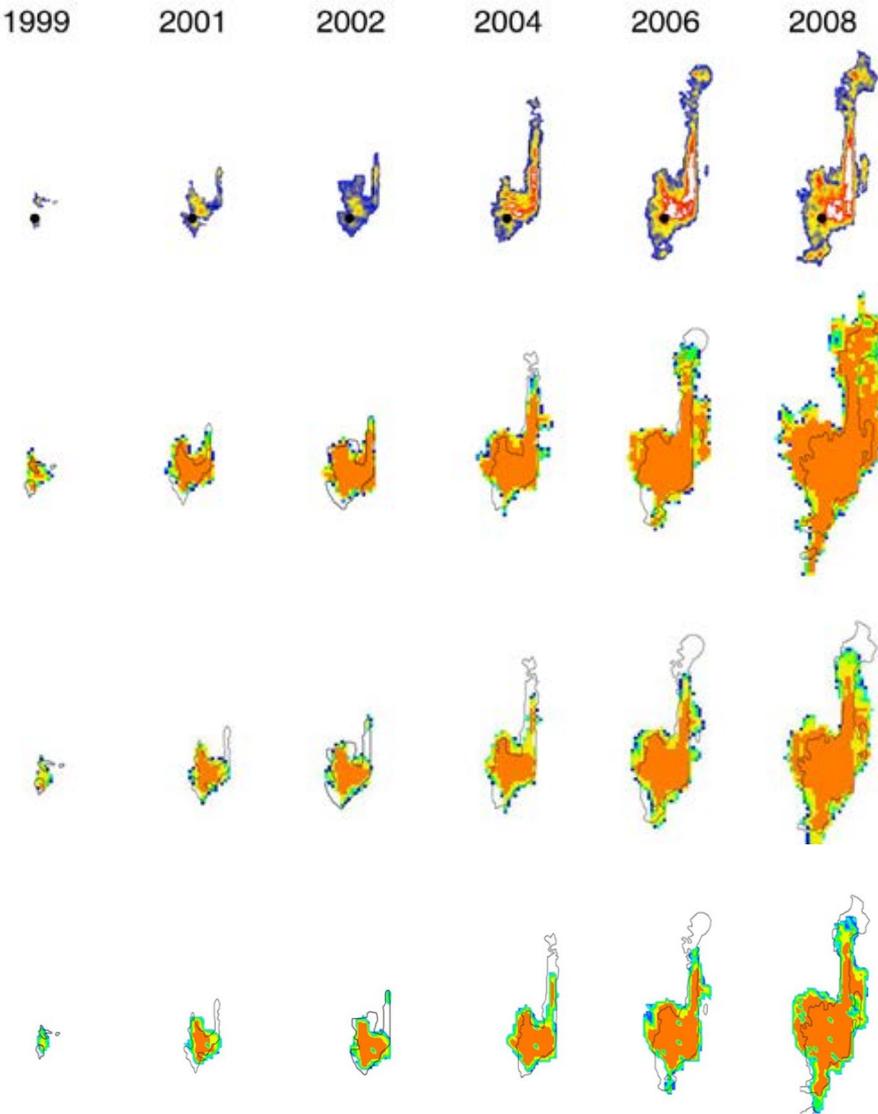
CO<sub>2</sub> Black Oil Simulator using the Vertical Equilibrium option

[Singh et al. \(2010\) using Eclipse 100/300](#)



[Haukaas et al. \(2013\)](#)

# Results of this study: Two calibrated models



Seismic response (Boait et al., 2012) = calibration targets

Calibrated Model 1: 1 Feeder,  $T=35$  °C,  $CH_4=1.8\%$  mol, Anisotropic permeability

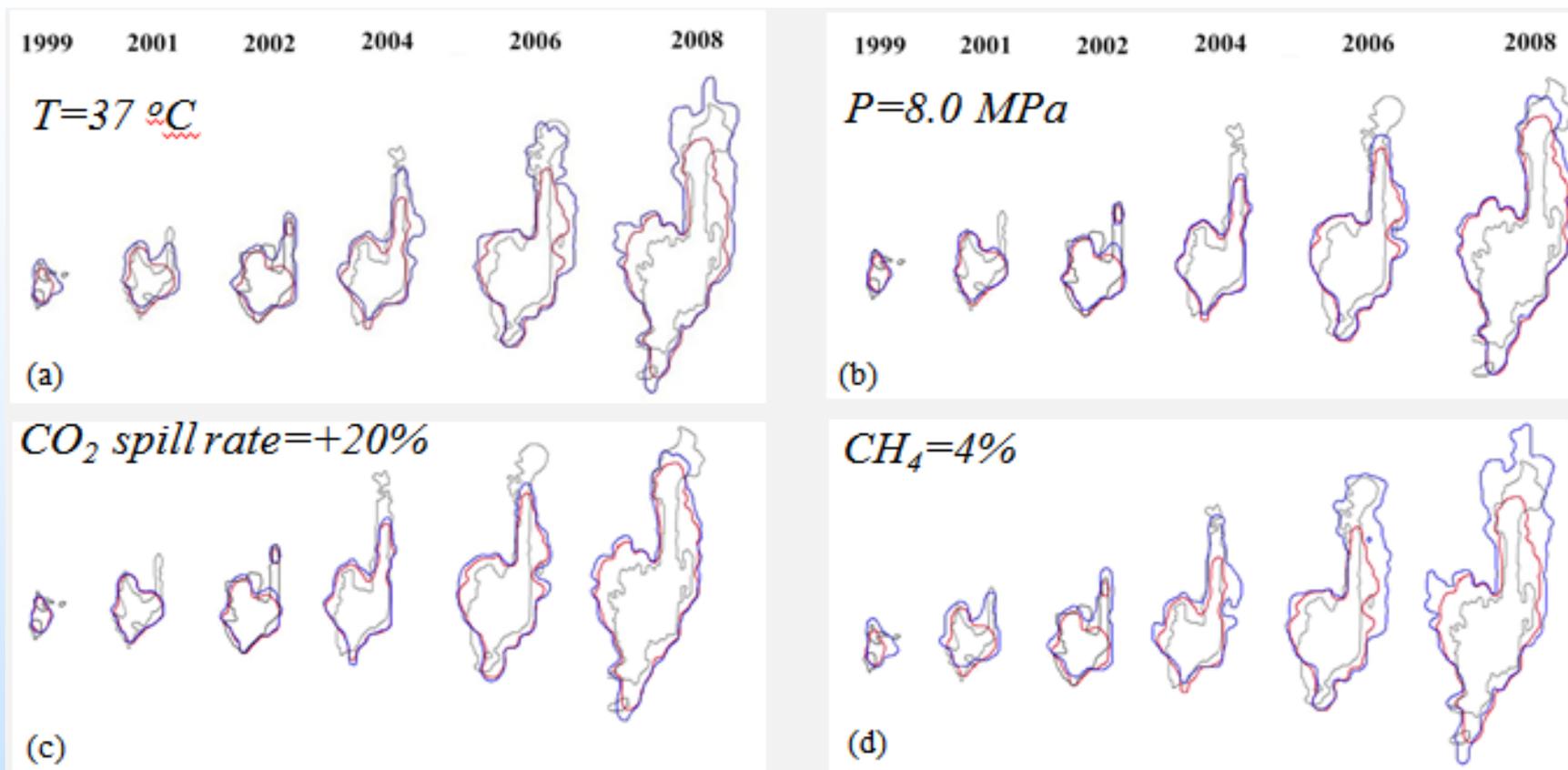
GEM<sup>®</sup>

Calibrated Model 2: 2 Feeders, Anisotropic permeability

Calibrated Model 2: TOUGH2

**Approximate history match can be achieved with widely available multi-phase compositional simulators and parameters reported in the literature**

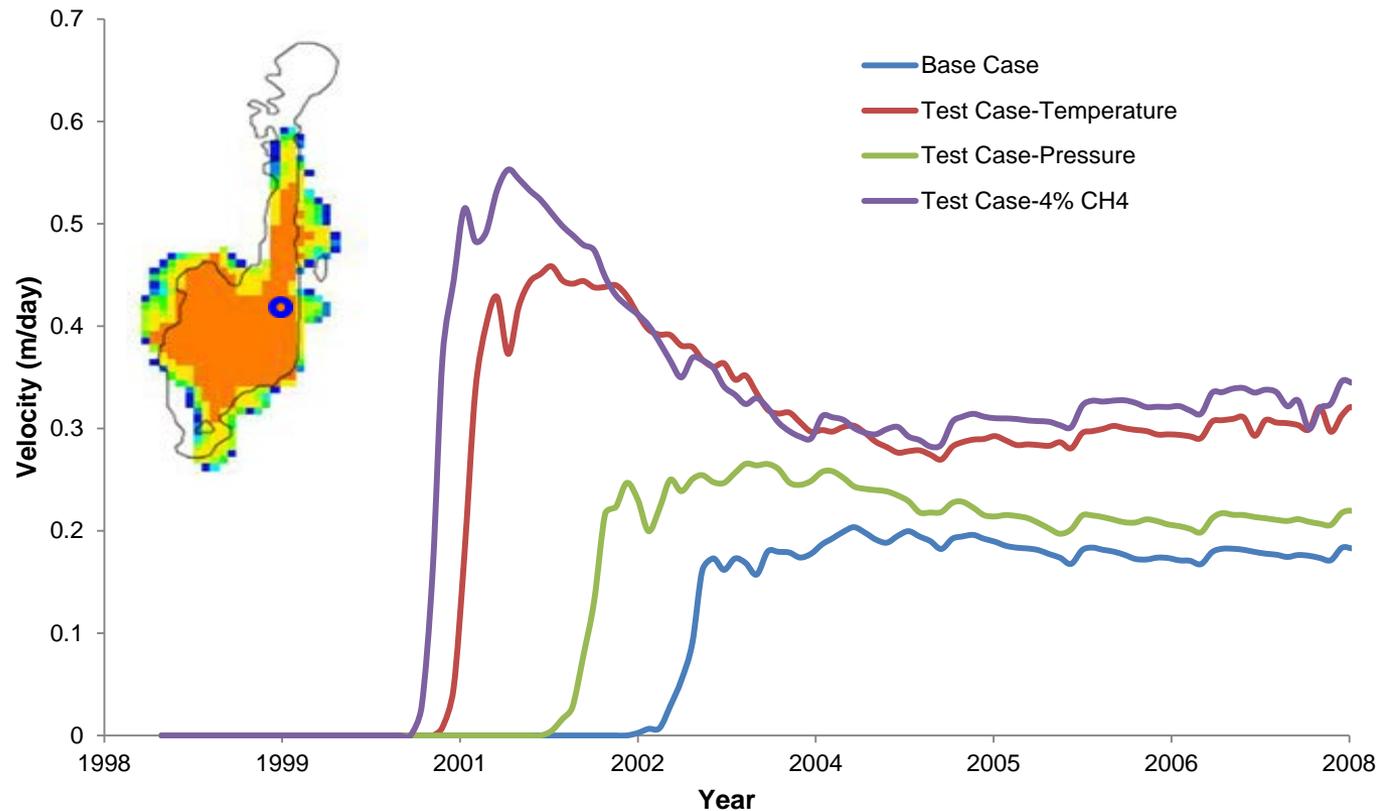
# Sensitivity analysis for aerial extent of CO<sub>2</sub> plume



(a)-(d): The black outlines represent CWC observed from 4D seismic (Boait et al., 2012); Red lines represent the Base Case; Blue lines in (a)-(d) represent simulated results of test cases

Base Case: Calibrated model 2 (2Feeders, Anisotropic permeability, with 33.2 °C and 8.3 MPa)

# CO<sub>2</sub> velocity along N-S for test cases

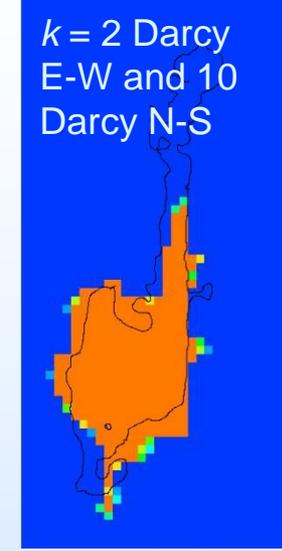
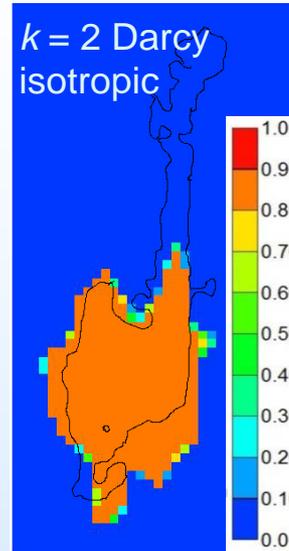
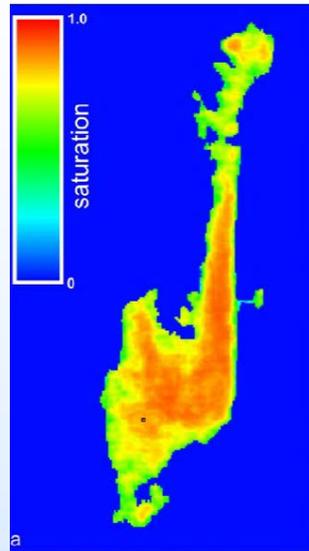


*Velocity at the position shown by the circle*

# First—Applying Permeability Anisotropy

## *N-S higher permeability supported by geology*

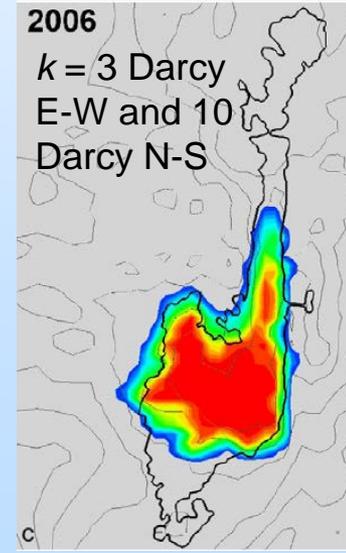
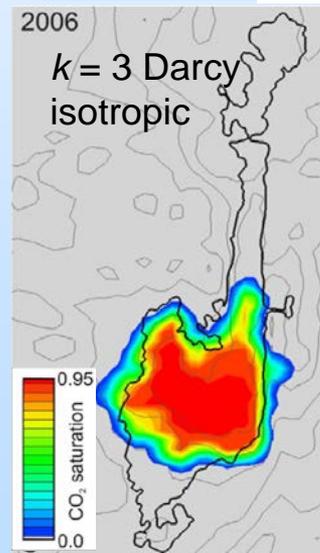
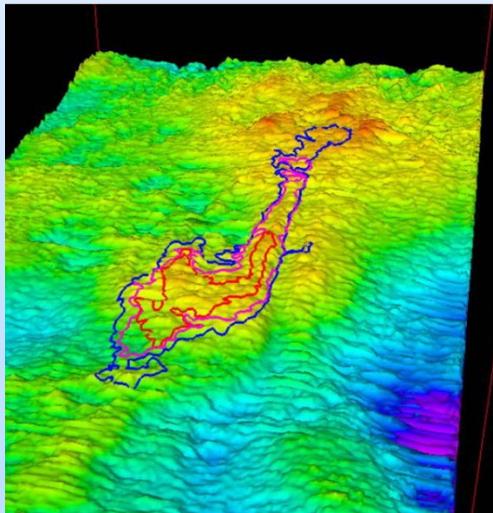
Observed extents



GEM simulation

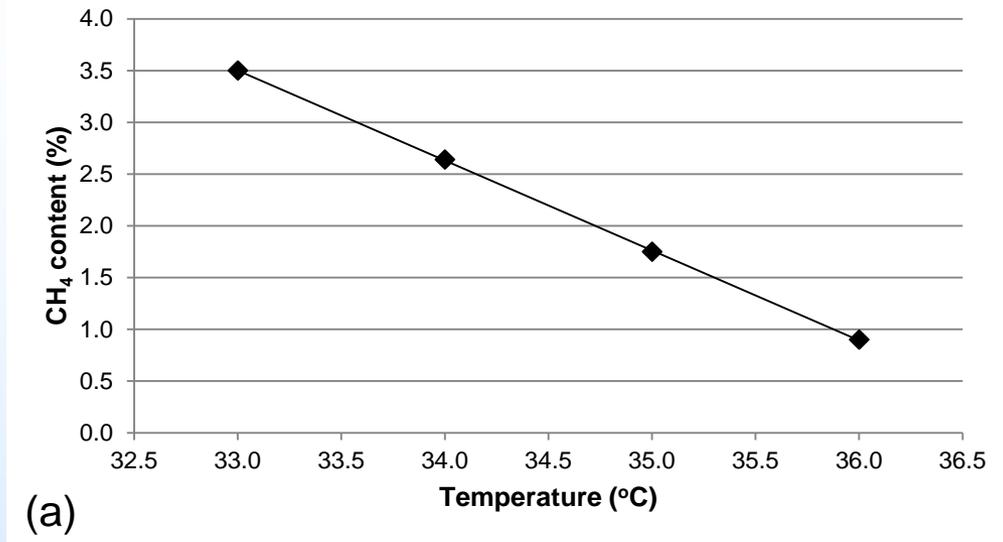
**Cannot achieve the match by adjusting permeability anisotropy alone**

Topography of the Layer 9.



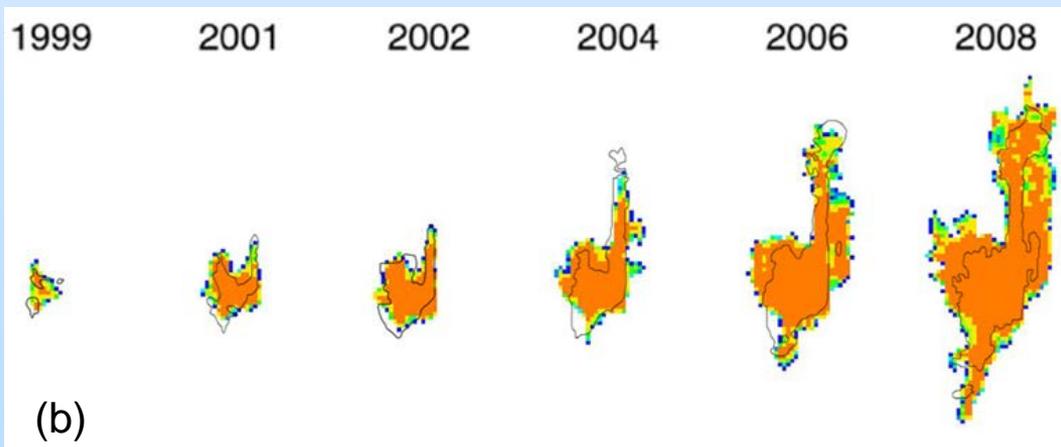
Tough 2 simulations (Chadwick and Noy, 2010)

# Calibrated Model 1: A combination of temperature and CH<sub>4</sub>



- CO<sub>2</sub> streams contain 1.5-2.5% methane and also butenes, toluenes, and xylenes (BTX) (Arts et al., 2008; Chadwick and Noy, 2010b; Zweigel et al., 2004; Zweigel and Heill, 2003).
- No direct measurements of reservoir  $T$  in Layer 9.  $T$  31.5 – 35 °C in literature

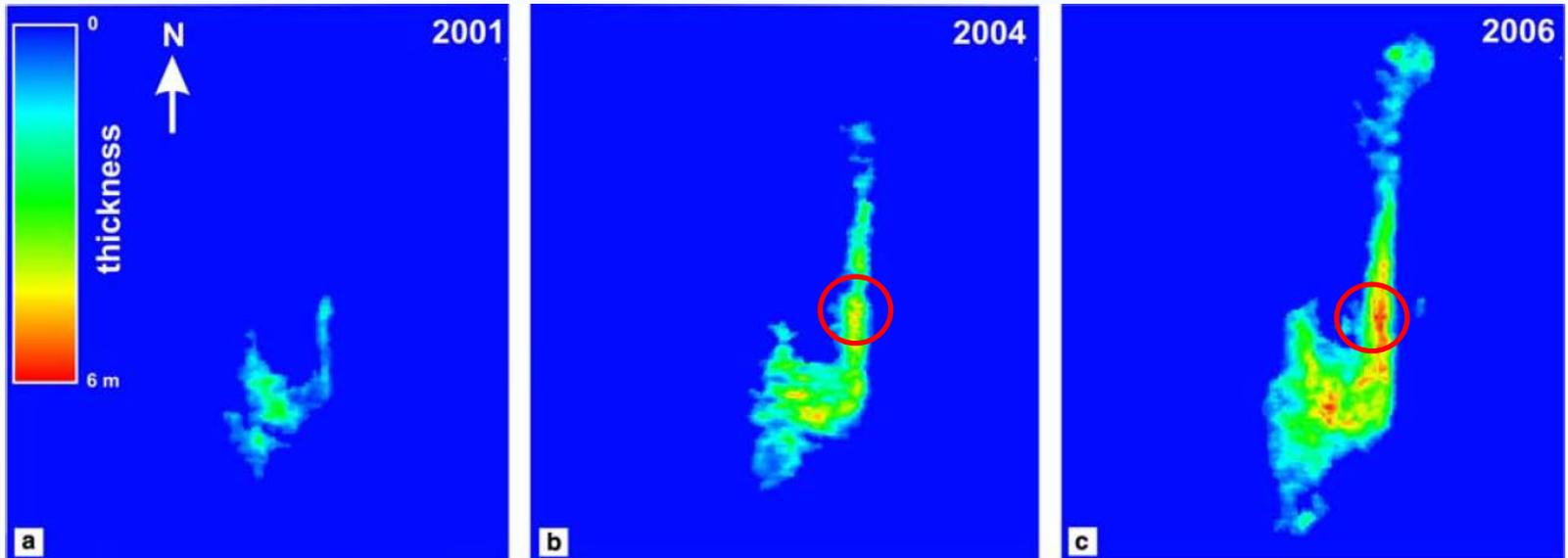
*Calibrated model 1: 1Feeder,  $T=34$  °C,  $CH_4=2.7\%$ , Anisotropic permeability*



*(a) Combinations of  $T$  and  $CH_4$  along the line can produce similar good match as “Test Case-1Feeder,  $T=35$  °C,  $CH_4=1.8\%$ ” (b) calibrated model 2: 1Feeder,  $T=34$  °C,  $CH_4=2.7\%$ , Anisotropic permeability*

# Calibrated Model 2: Additional Feeder together with Permeability Anisotropy

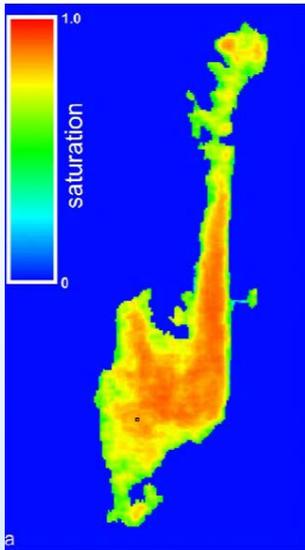
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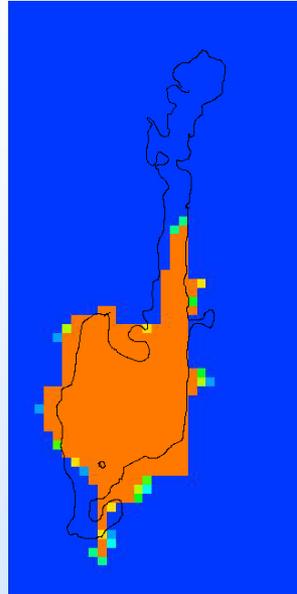
CO<sub>2</sub> plume thicknesses derived from reflection amplitudes (Chadwick and Noy, 2010). A thick area of CO<sub>2</sub> plume (red circle) is clearly shown in 2004 and 2006 map. Propose to add a second feeder to that area after year 2001.



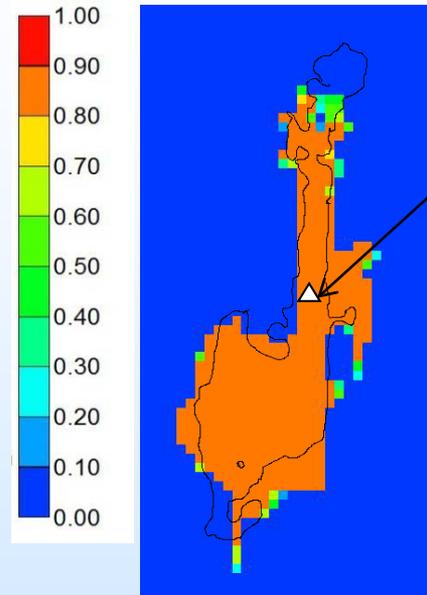
# Calibrated Model 2: -Additional Feeder with Permeability Anisotropy



Observed extents  
2006



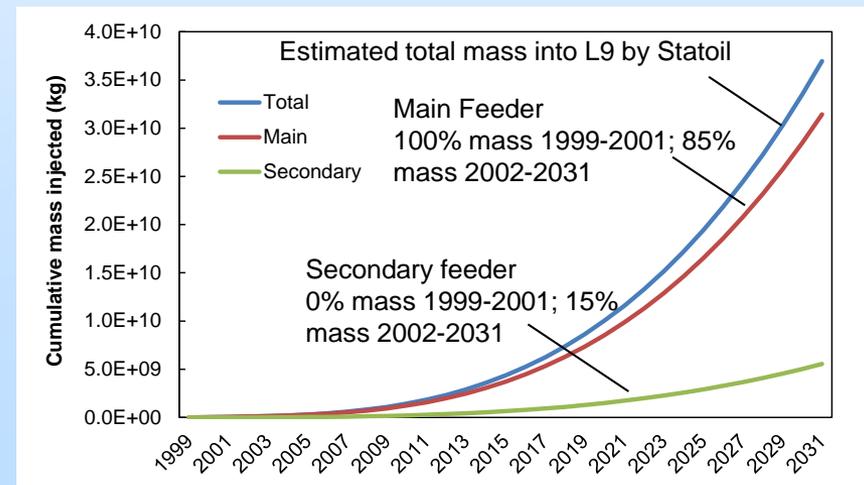
100% CO<sub>2</sub> volume  
into main feeder



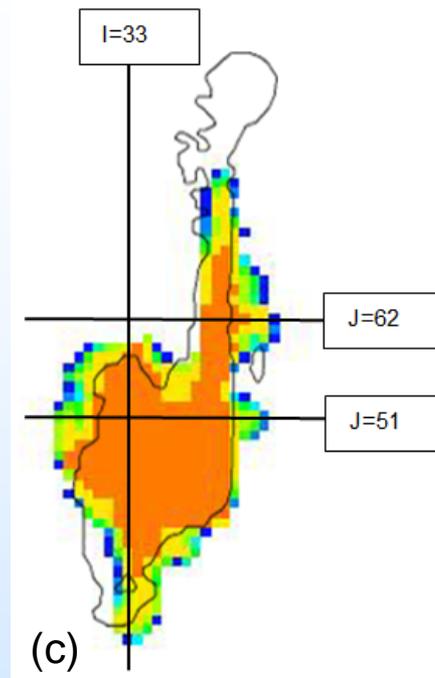
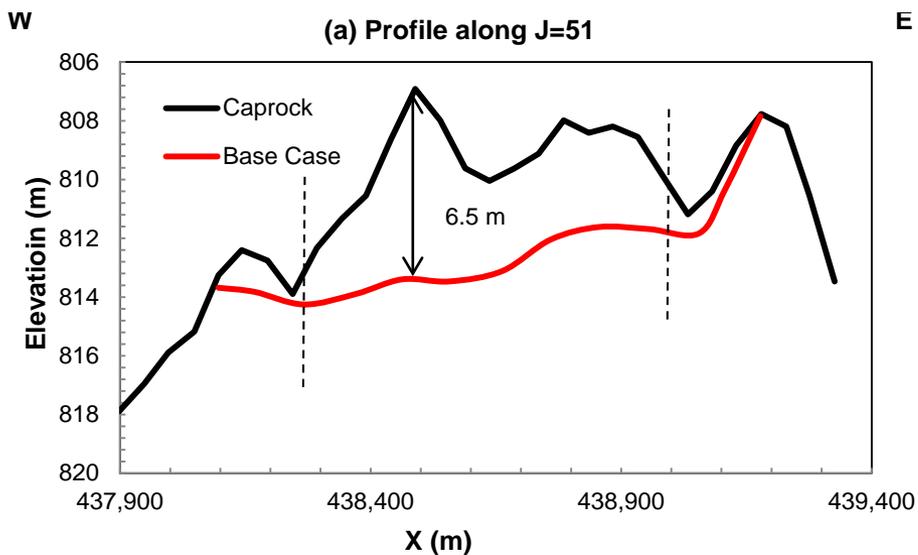
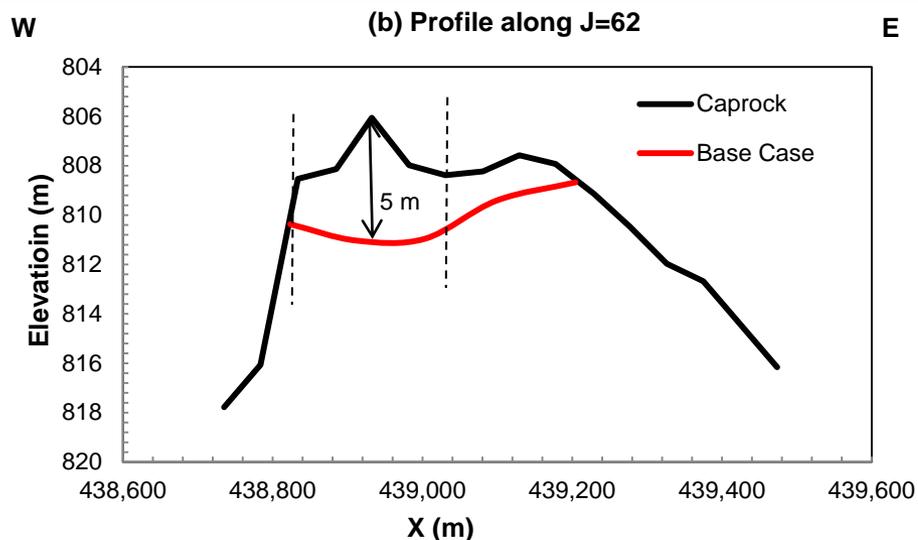
Second feeder

85% CO<sub>2</sub> volume injected  
into the main feeder and  
15% into the second  
feeder (the triangle)  
starting from 2002.

**Acceptable results with the  
second feeder.**

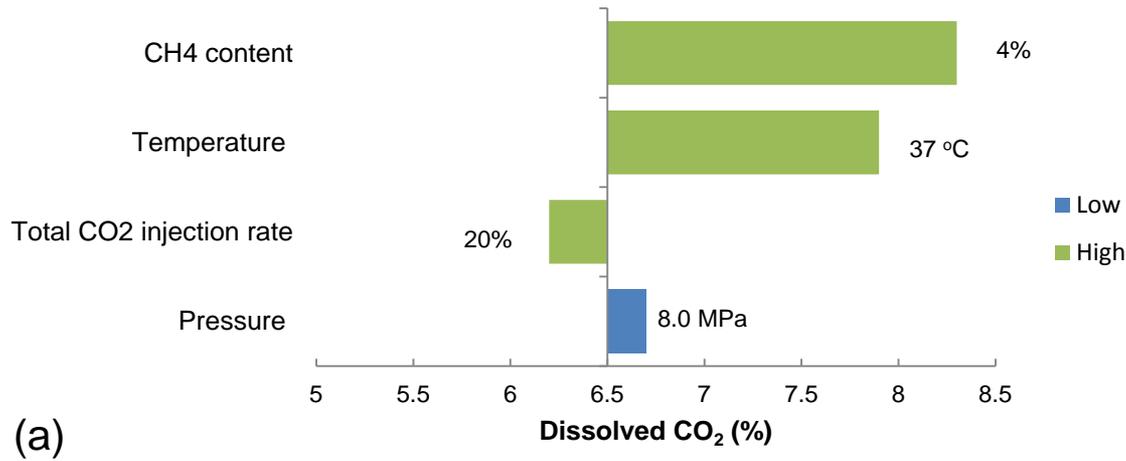


# Topography uncertainty effect: Vertical profile of the CO<sub>2</sub> plume in 2006

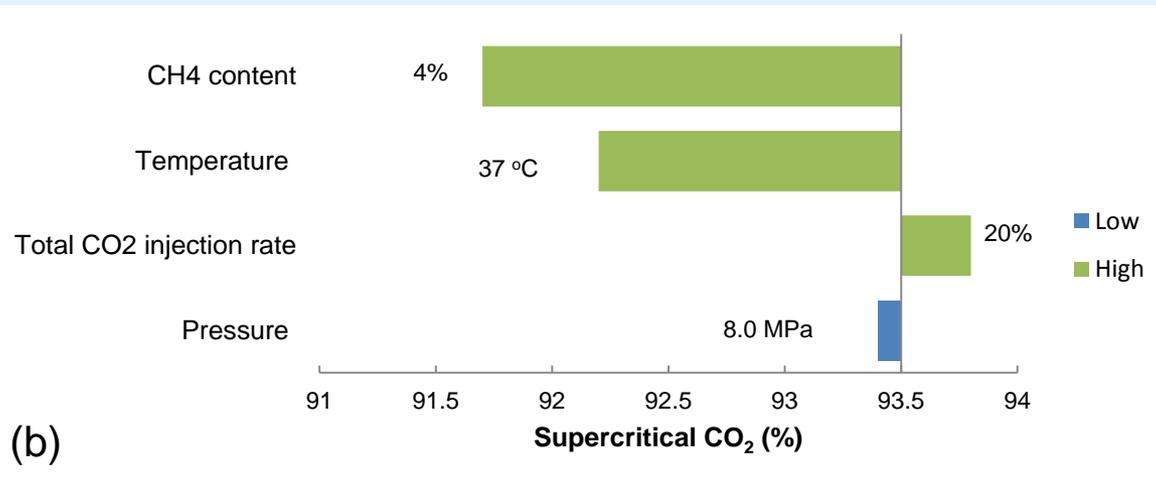


(a),(b): red lines: simulated bottom of the CO<sub>2</sub> plume; black lines: the topography of the caprock bottom; vertical black dash lines: the boundary of CO<sub>2</sub> plume

# Sensitivity analysis for CO<sub>2</sub> fate



*Structural trapping*

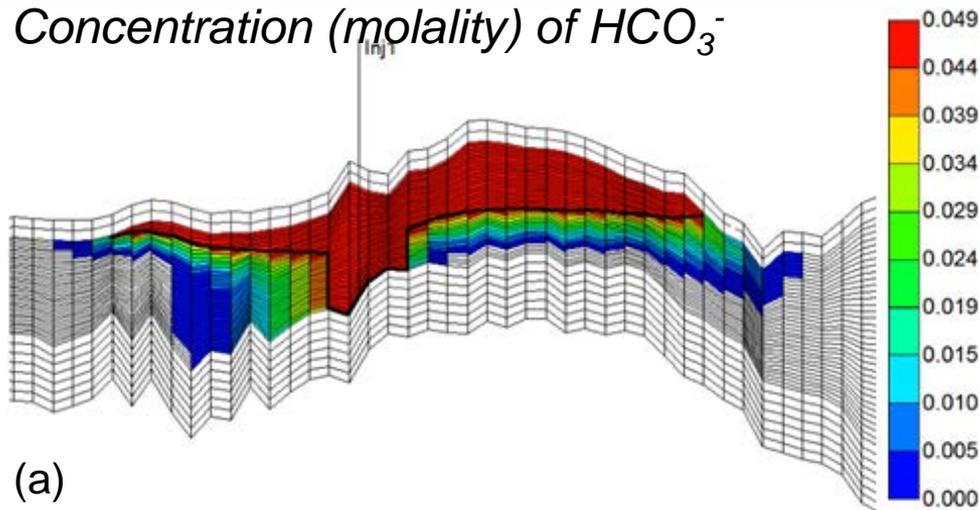


*Solubility trapping*

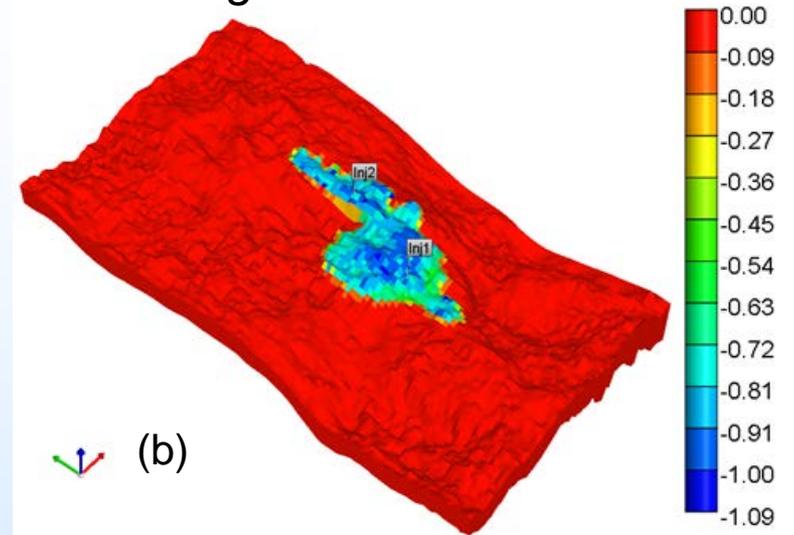
(a),(b): Green color denotes parameter values higher than those in the Base Case and blue color lower than those for the Base Case

# Geochemical process in model structure: Geochemical results

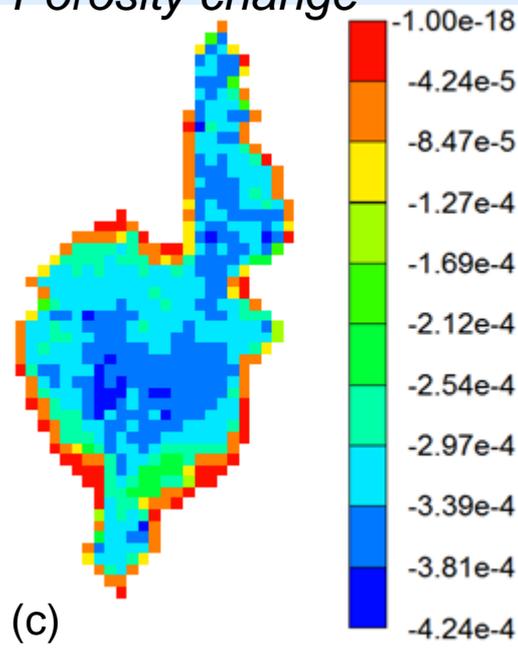
Concentration (molality) of  $\text{HCO}_3^-$



Percentage of calcite dissolution

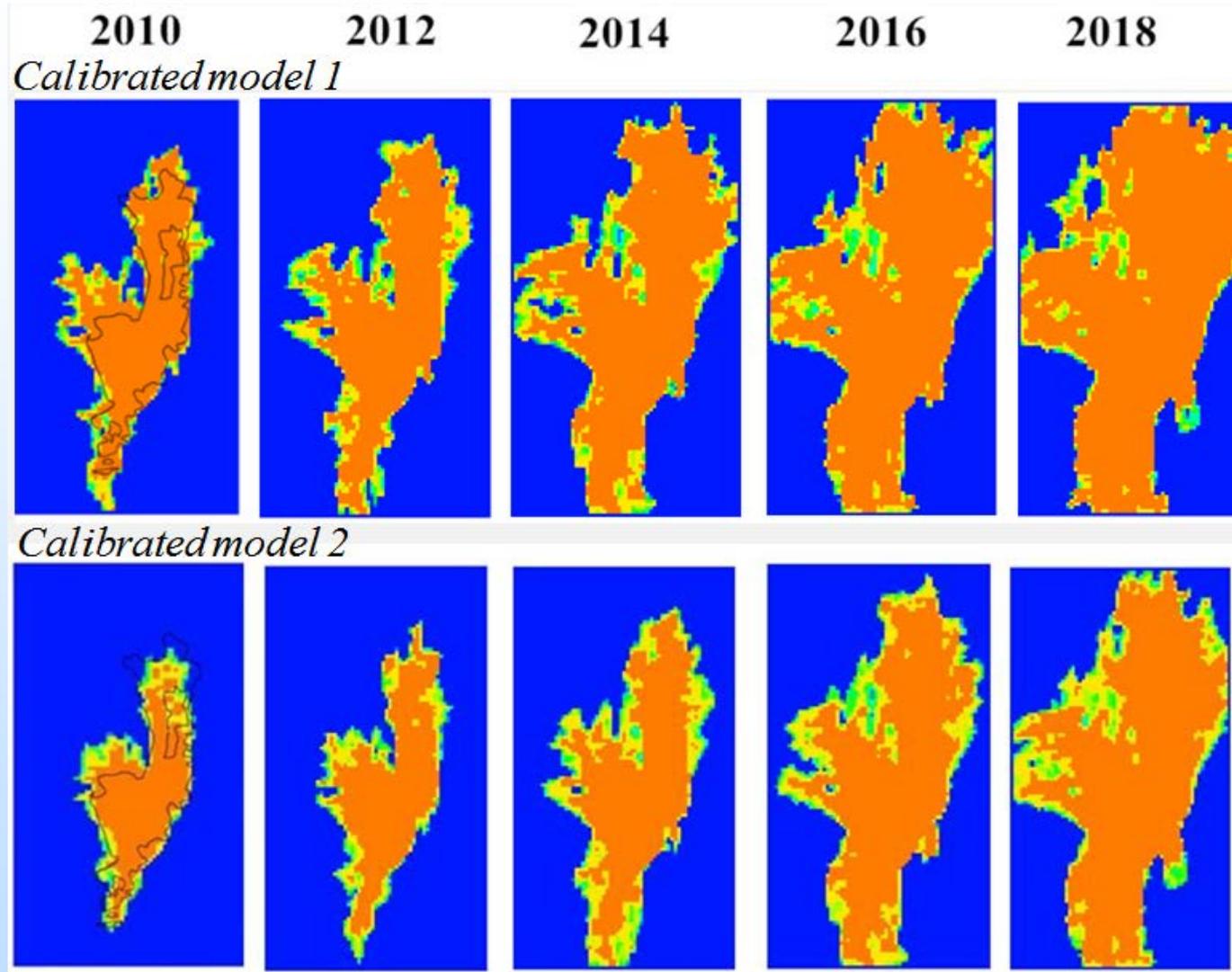


Porosity change



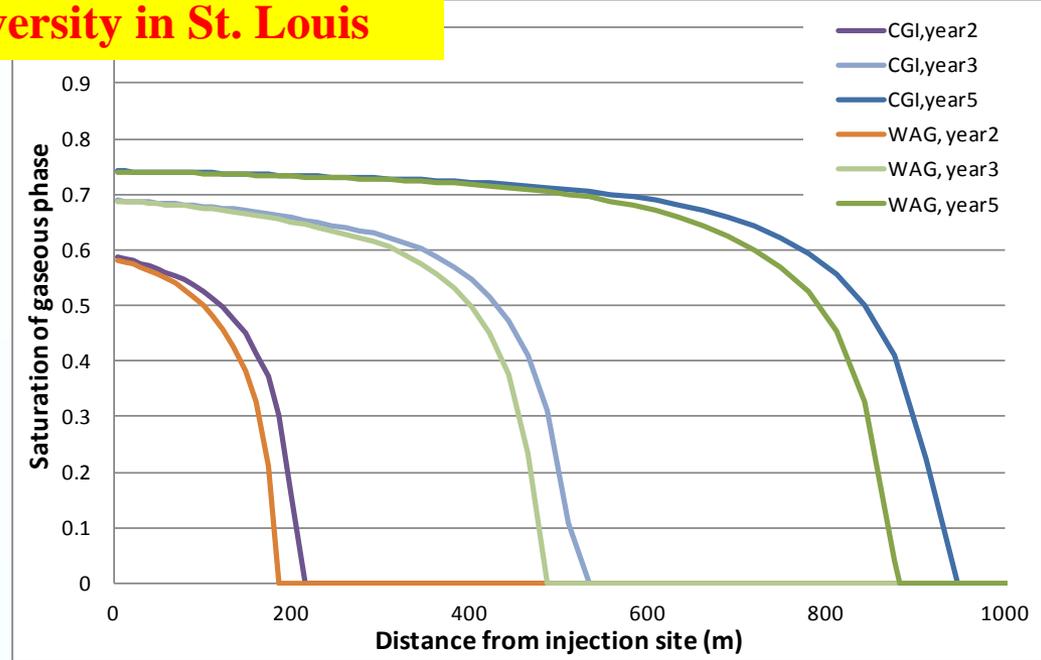
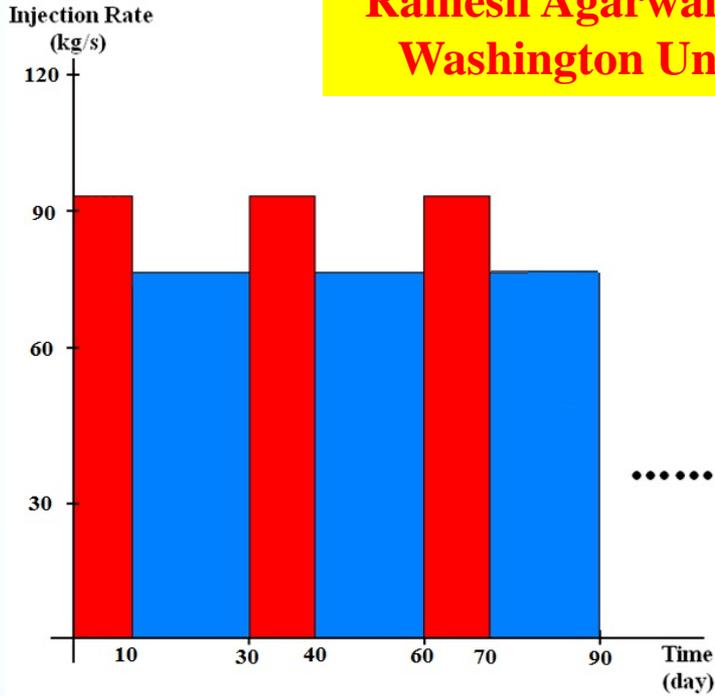
(a) The concentration at the section crossing  $l=33$  (b) distribution at the top sub-layer of Layer 9 in 3D in 2006 (c) distribution at the top sub-layer of Layer 9 in 2006; negative value represents the increase of the porosity due to mineral dissolution.

# Model Predictions



# Water-alternating Gas (WAG) injection– axisymmetric Utsira model

**Ramesh Agarwal and Zheming Zhang**  
**Washington University in St. Louis**



*Optimal WAG pattern, and CO<sub>2</sub> migration for CGI and WAG injection, axisymmetric Utsira formation*

|               | $I_{CO_2}$ (kg/s) | $I_{water}$ (kg/s) | WAG         | <i>Fitness (m/k ton of water)</i> |
|---------------|-------------------|--------------------|-------------|-----------------------------------|
| Optimal Value | <b>95.75</b>      | <b>75.32</b>       | <b>0.64</b> | <b>0.0251</b>                     |

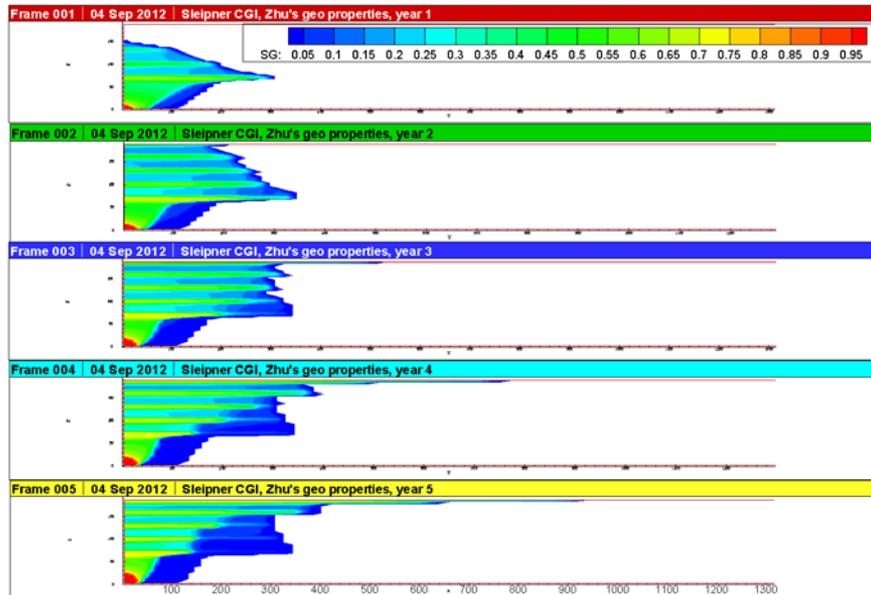
*Optimal WAG injection pattern, 2D Utsira formation*

| CGI                              |                | WAG                              |  |                                       |   |                |
|----------------------------------|----------------|----------------------------------|--|---------------------------------------|---|----------------|
| CO <sub>2</sub> Radial Migration | Dissolution    | CO <sub>2</sub> Radial Reduction | CO <sub>2</sub> Radial Reduction Ratio | CO <sub>2</sub> Impact Area Reduction | CO <sub>2</sub> Impact Area Reduction Ratio | Dissolution    |
| <b>946.7 m</b>                   | <b>16.89 %</b> | <b>65.2 m</b>                    | <b>6.89 %</b>                          | <b>372,095 m<sup>2</sup></b>          | <b>13.23 %</b>                              | <b>23.43 %</b> |

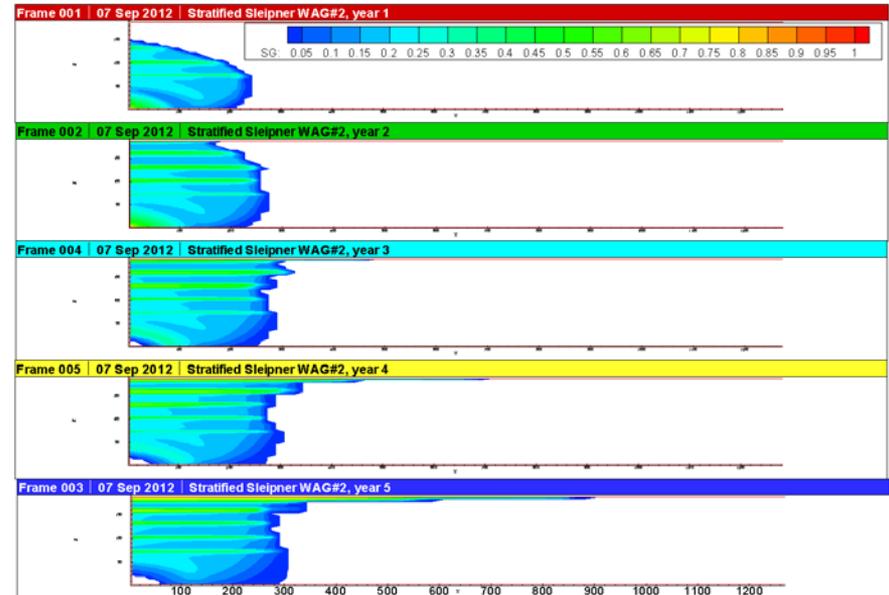
*Summary of the best benefits for adopting WAG injection scheme, axisymmetric Utsira formation*

# WAG injection pattern design – WAG for axisymmetric Utsira formation

Collaboration with  
Ramesh Agarwal and Zheming Zhang, Washington University in St. Louis



*In situ CO<sub>2</sub> migration for CGI operation, year 1~5*



*In situ CO<sub>2</sub> migration for optimal WAG operation, year 1~5*

# Conclusions from Modeling Study

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- **Approximate match between simulations based on Sleipner benchmark model and seismic delineated CO<sub>2</sub> plume history can be achieved with two widely available multi-phase compositional simulators**
- **History match is labor and computational intensive, our approximate match resulted from hundreds of simulations on supercomputers**
- **Introducing permeability anisotropy is necessary and justifiable based on geology**
- **A combination of reservoir temperature and CH<sub>4</sub> % within the ranges in literature can result in approximate match**
- **Adding second feeder help achieve match with observed plume development**
- **Model-predicted plume thickness, CO<sub>2</sub> saturation, CO<sub>2</sub> solubility, none of them used as calibration targets, are comparable with those based on seismic data interpretations (including mass of CO<sub>2</sub> spilled into Layer 9);**
- **Even with a range of uncertain modeling parameters, the predicted fate of CO<sub>2</sub> is within a narrow band, ~93±2% structural/hydrodynamic trapping and ~7±2% solubility trapping**
- **Modeling results provide feedback to monitoring and characterization needs**



# Accomplishments to Date

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1. Acquired datasets for the Sleipner project, one of the best field dataset for U.S. scientists, engineers, and students working on CCUS. Fulfilling the international/global collaboration program need;
2. Simulated multiphase reactive flow in Layer 9 and calibrated two models against 4D plume migration data;
3. Conducting parameter sensitivity analysis;
4. Submitted a manuscript to a peer-referred journal and gave conference presentations;
5. Continuing coupled reactive transport model to evaluate long-term effects on reservoir prosperities by water-rock interactions.



# Summary- **Key Findings & Lessons Learned**

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- **Can we predict CO<sub>2</sub> plumes at proposed sites (size, directions) ?**
  - Yes, we can. Accurate enough for AoR?
- **What takes to match the CO<sub>2</sub> plume history at Sleipner?**
  - We matched it without using out of ordinary parameters or assumptions, and with two widely available reservoir simulators.
- **Do we understand CO<sub>2</sub>-H<sub>2</sub>O multi-phase flow in geological systems?**
  - Reasonably well, (a) we approximately matched the plume migration history; (b) model-predicted CO<sub>2</sub> solubility, CO<sub>2</sub> saturation (?), plume thickness match with geophysical interpretations; (c) plume aerial extent and thickness match with estimated CO<sub>2</sub> spill into Layer 9.



# Summary (continued)

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## – Future Plans:

- 1) Develop coupled reactive transport model to simulate long-term CO<sub>2</sub> fate
  - a) Complete conceptual model and axisymmetric TOUGHReact modeling of Utsira Sand
  - b) Calcite dissolution with reservoir geometry

Hypothesis: Models have over-predicted mineral dissolution – precipitation reactions. Using realistic rate laws would see much less reactions



# Appendix

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- These slides will not be discussed during the presentation, **but are mandatory**



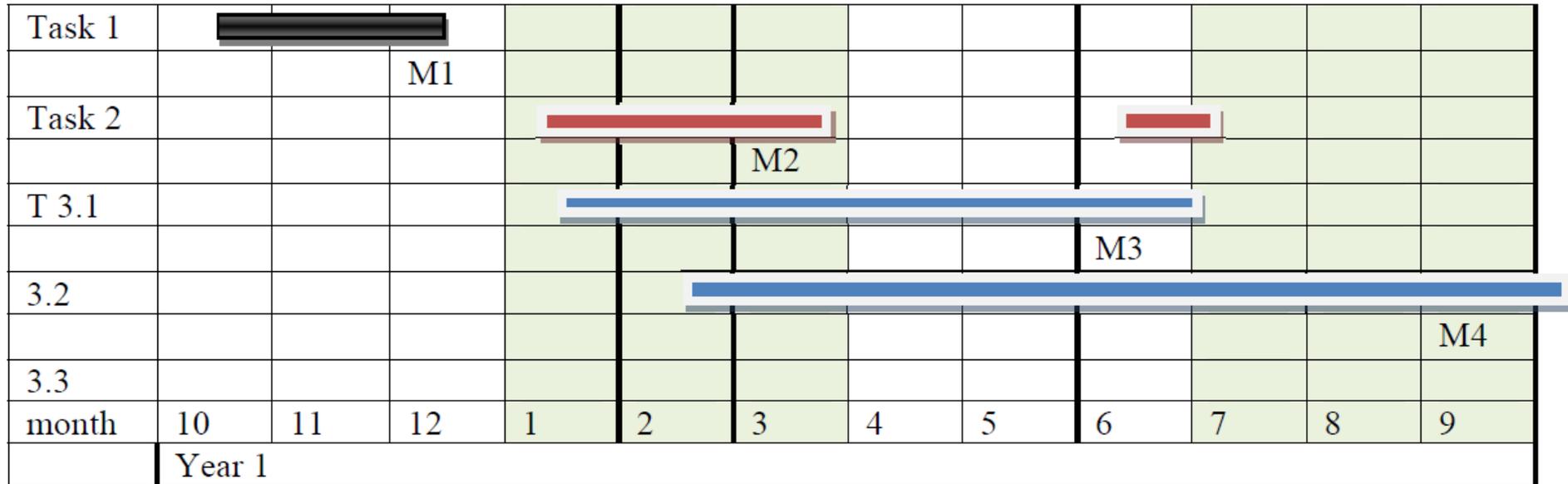
# Organization Chart

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- **PRINCIPAL INVESTIGATOR**
- Professor Chen Zhu
- Indiana University
- 
- **Co-Principal Investigator**
- Professor Per Aaggard
- University of Oslo



# Gantt Chart

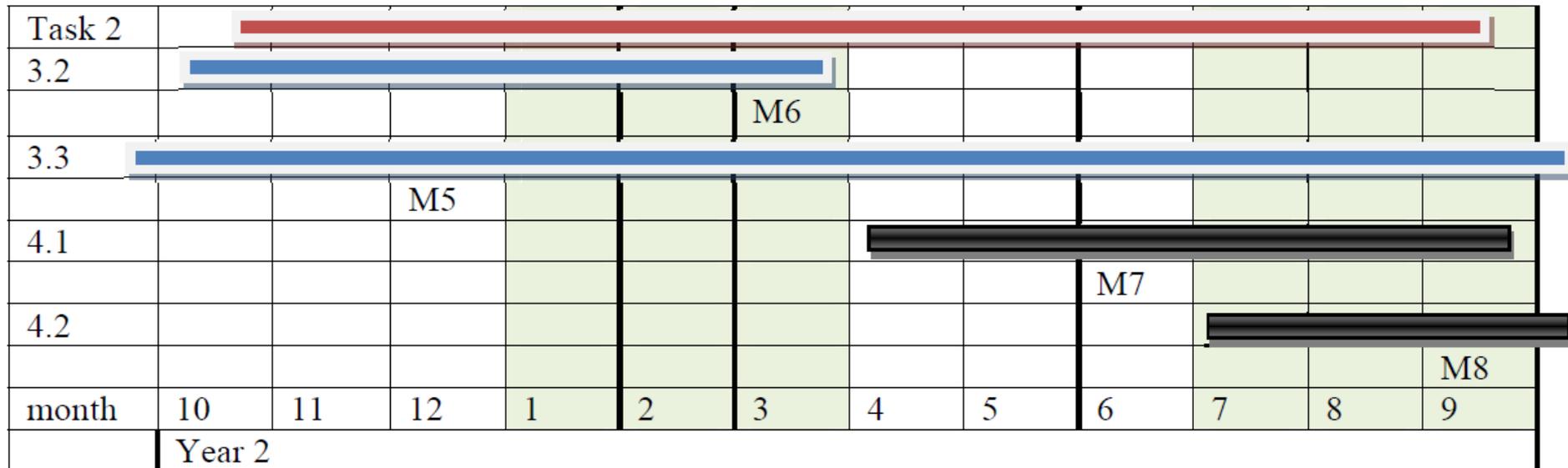


**TASK 1.0 - PROJECT MANAGEMENT, PLANNING AND REPORTING**

**TASK 2.0 – DATA ACQUISITION AND INTERPRETATION**

**TASK 3.0 – HISTORY MATCHING OF CO<sub>2</sub> PLUME MIGRATION WITH A RESERVOIR MODEL**

# Gantt Chart



**TASK 1.0 - PROJECT MANAGEMENT, PLANNING AND REPORTING**

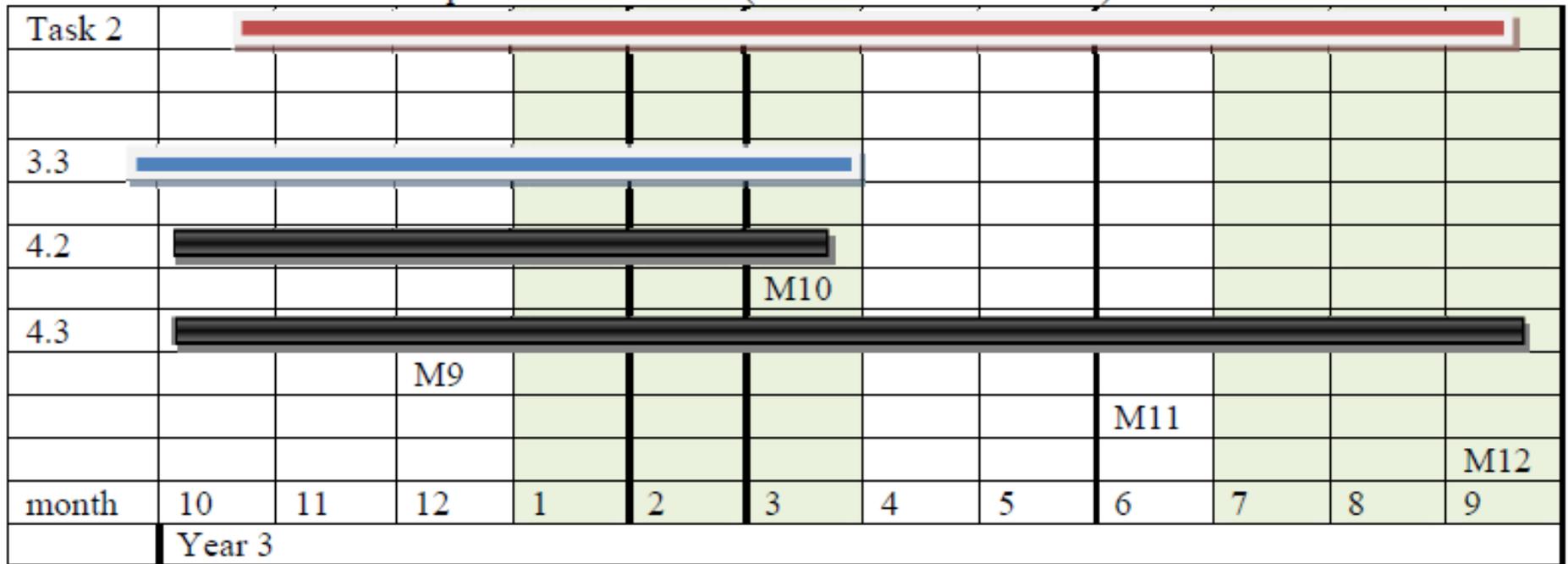
**TASK 2.0 – DATA ACQUISITION AND INTERPRETATION**

**TASK 3.0 – HISTORY MATCHING OF CO<sub>2</sub> PLUME MIGRATION WITH A RESERVOIR MODEL**

**TASK 4.0 – MODELING LONG-TERM CO2 FATE**

# Gantt Chart

Chart 1. Timeline of the completion of the Tasks (M stands for milestones).



**TASK 3.0 – HISTORY MATCHING OF CO<sub>2</sub> PLUME MIGRATION WITH A RESERVOIR MODEL**

**TASK 4.0 – MODELING LONG-TERM CO<sub>2</sub> FATE**

# Bibliography

- Peer-reviewed journal articles:

- Zhu C, Lu P, Zhang GR (submitted after revision August 3, 2014 ) Benchmark modeling of the Sleipner CO<sub>2</sub> plume: Calibration to seismic data for the uppermost layer and model sensitivity analysis. *The International Journal of Greenhouse Gas Control*
- Ji, X. and Zhu, C. (2013) Predicting possible effects of H<sub>2</sub>S impurity on CO<sub>2</sub> transportation and geological storage. *Environmental Science & Technology*. [dx.doi.org/10.1021/es301292n](http://dx.doi.org/10.1021/es301292n).
- Lu, P., Fu, Q., Seyfried Jr., WE, Jones, K., and **Zhu**, C. (2013) Coupled alkali feldspar dissolution and secondary mineral precipitation in batch systems: 2. Effects of CO<sub>2</sub> and implications for carbon sequestration. *Applied Geochemistry* Doi 10.1016/j.apgeochem.2012.04.005
- Ji, X. and Zhu, C., 2013, A SAFT Equation of State for the Quaternary H<sub>2</sub>S-CO<sub>2</sub>-H<sub>2</sub>O-NaCl system. *Geochimica et Cosmochimica Acta* v.91, p. 40–59, <http://dx.doi.org/10.1016/j.gca.2012.05.023>.
- Liu, Y., P. Lu, C. Griffith, Y. Soong, S. W. Hedges, H. Hellevang, C. Zhu, 2012, CO<sub>2</sub>-caprock-brine interaction: Reactivity experiments on Eau Claire Shale and a review of literature. *The International Journal of Greenhouse Gas Control*, v.7, p.153–167, [doi.org/10.1016/j.ijggc.2012.01.012](http://doi.org/10.1016/j.ijggc.2012.01.012).



# Bibliography (continued)

- Conference proceeding papers and abstracts:
  - Ji, X. and Zhu, C (2013) A SAFT Equation of State for the H<sub>2</sub>S-CO<sub>2</sub>-H<sub>2</sub>O-NaCl system and applications for CO<sub>2</sub> - H<sub>2</sub>S transportation and geological storage. *Energy Procedia*. 12 pages.
  - Zhu, C., Lu, P (2013) Coupling of dissolution and precipitation reactions as the main contributor to the apparent discrepancy between lab and field reaction rates. *Procedia of Earth and Planetary Sciences*. (7)948-952, International Symposium on Water-Rock Interaction WRI-14, 4 pages. DOI 10.1016/j.proeps.2013.03.051. PROEPS317
  - Lu, P., Zhu, C., and Aaggard, P. (2012) Reducing Uncertainties in Model Predictions via History Matching of CO<sub>2</sub> Plume Migration at the Sleipner Project, Norwegian North Sea, American Institute of Chemical Engineers (AIChE) 2012 Annual Meeting, Pittsburgh, October, 2012.
  - Ji, X. and Zhu C. (2012) Thermodynamic study for CO<sub>2</sub> storage in deep saline aquifers. 11th International Greenhouse Gas Control Technology meeting (GHGT-11), November 18-22, 2012, Kyoto, Japan.



# Bibliography (continued)

- Conference proceeding papers and abstracts (continued):
  - Ji X. and Zhu C. (2011) A SAFT Equation of State for the Quaternary H<sub>2</sub>S-CO<sub>2</sub>-H<sub>2</sub>O-NaCl System. American Geophysical Union Annual meeting, San Francisco, December 5 -10, 2011.
  - Guanru Zhang, Peng Lu, Chen Zhu, , Zheming Zhang and Ramesh Agarwal. Model Predictions via History Matching of CO<sub>2</sub> Plume Migration at the Sleipner Project, Norwegian North Sea. American Geophysical Union Annual meeting, San Francisco, December 9 -15, 2013
  - Zheming Zhang, Ramesh Agarwal and Chen Zhu, Optimization of CO<sub>2</sub> Storage in Saline Aquifers Using Water-Alternating Gas (WAG) Scheme – Case Study for Utsira Formation. American Geophysical Union Annual meeting, San Francisco, December 9 -15, 2013

## Book chapter:

- Ji X and Zhu C (submitted) “CO<sub>2</sub> storage in deep saline aquifers” A chapter in Novel Materials for Carbon Dioxide Mitigation Technology to be published by Elsevier.

