

National Risk Assessment Partnership - Strategic Monitoring for Uncertainty Reduction

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U.S. Department of Energy

National Energy Technology Laboratory

Mastering the Subsurface Through Technology Innovation, Partnerships and Collaboration:
Carbon Storage and Oil and Natural Gas Technologies Review Meeting

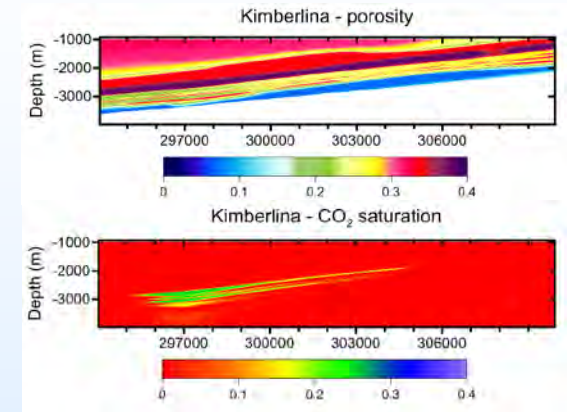
August 13-16, 2018

Presentation Outline

- Introduction
- Models and Datasets
- Geophysical Monitoring of Leakage through Legacy Wells
- Geophysical Monitoring of Leakage through a Dipping Fault
- Risk-Based Monitoring Network Design Tools
- Summary

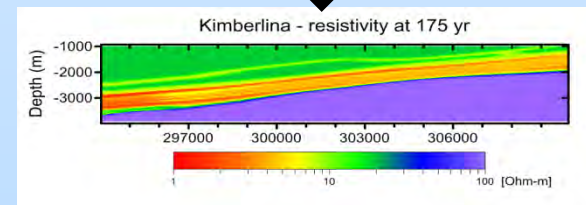
Introduction

Resistivity/EM methods	Seismic methods	Gravity method
sensitivity to fluid properties	sensitivity to changes in bulk properties	sensitivity to changes in density
Porosity	Porosity	Porosity
Permeability	Permeability	
Brine/CO ₂ /Residual saturations	Brine/CO ₂ /Residual saturations	Brine/CO ₂ /Residual saturations
Brine Salinity (TDS)		
	Density	Density
	Pressure	
Temperature		
Rock type	Rock type	Rock type
Resistivity	Seismic velocities	Density



Multiphysics models

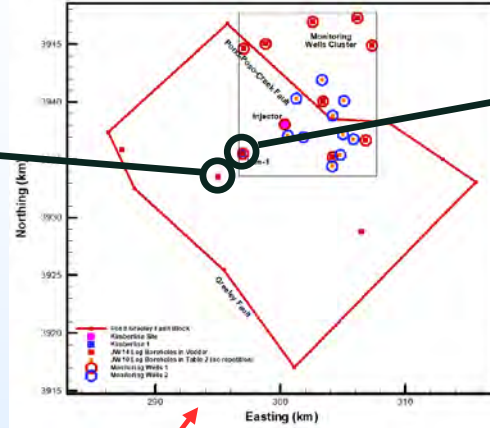
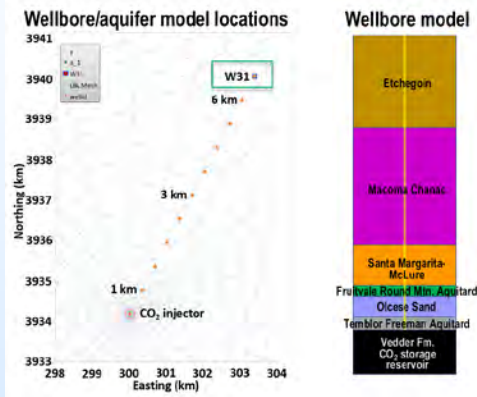
**Rock-physics or
constitutive
relationships**



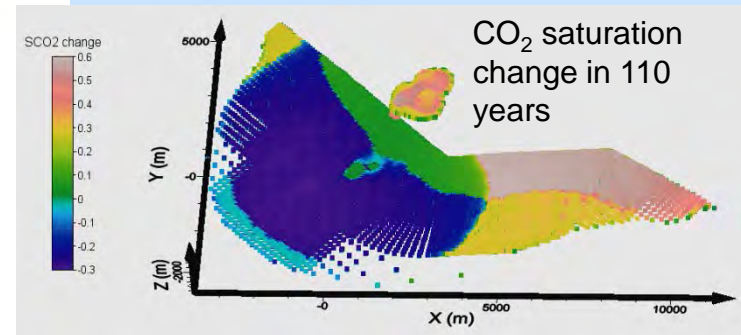
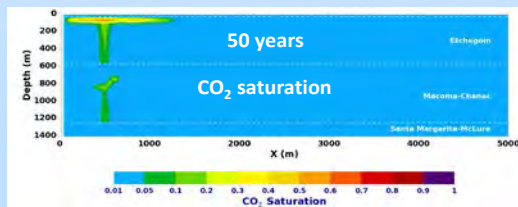
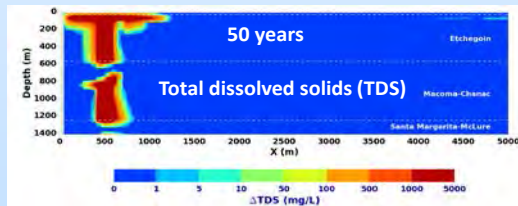
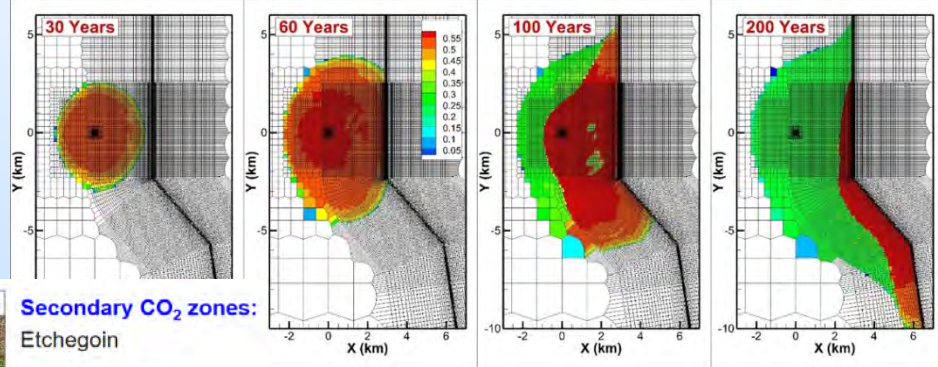
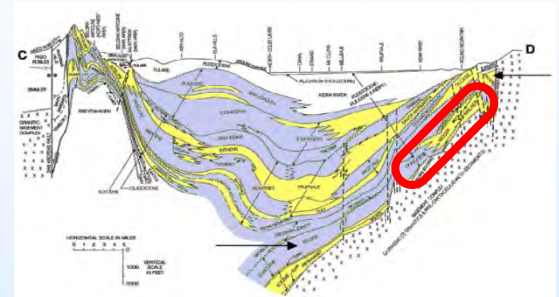
Geophysical models

Models/Datasets

Kimberlina 1.1 and 1.2: Leakage through legacy wells



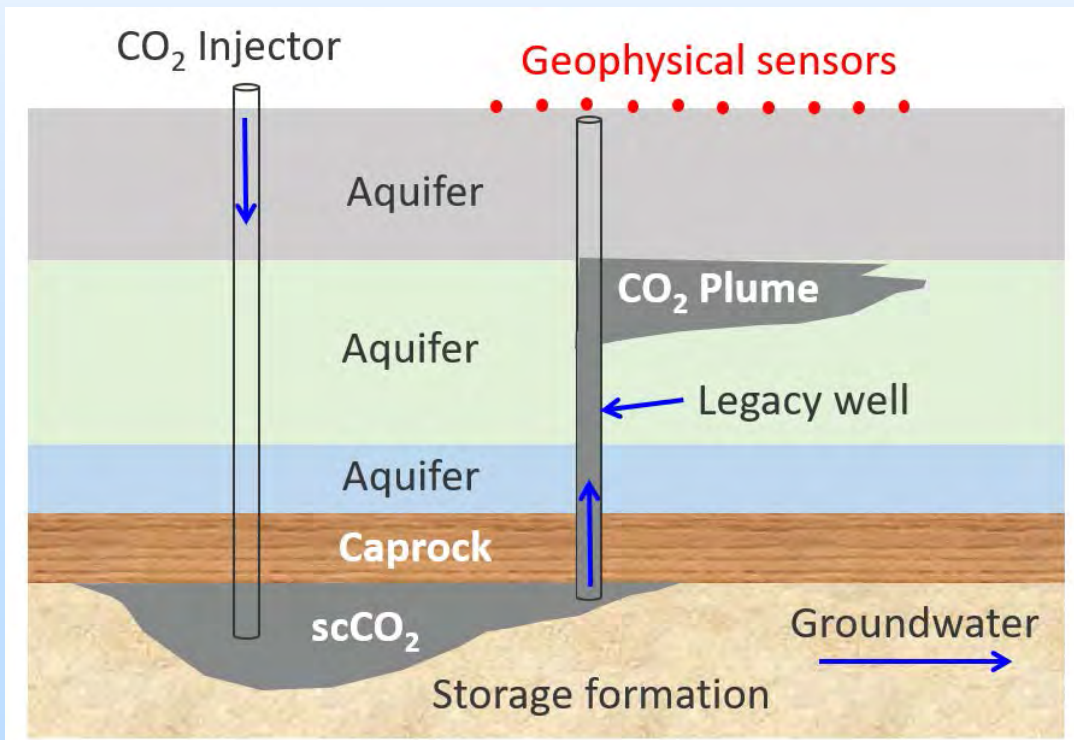
Kimberlina II: Leakage through a dipping fault



Geophysical Monitoring of Brine and CO₂ Leakage through a Legacy Well into Shallow Aquifers (1)

Xianjin Yang, Thomas A. Buscheck, Kayyum Mansoor, Susan Carroll, LLNL
Zan Wang, NETL and Delphine Appriou, PNNL

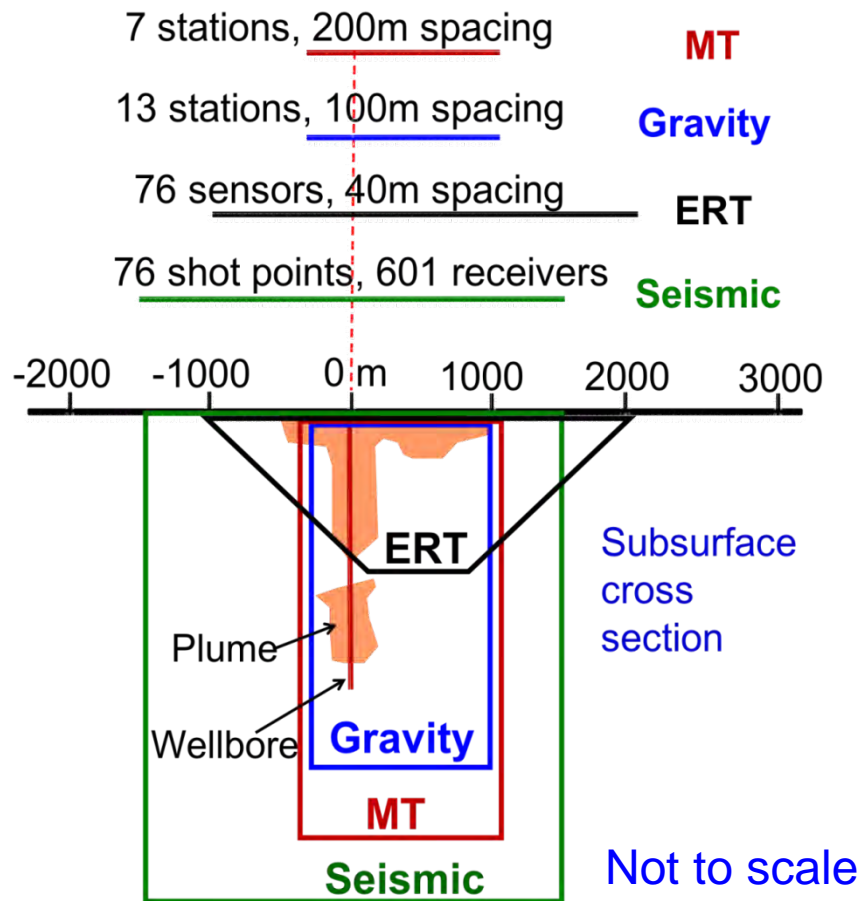
- Assess the effectiveness of monitoring methods to detect leakage
- Develop optimized monitoring designs with the DREAM tool
- Develop monitoring design and analysis approaches that can be incorporated into integrated assessment model (IAM) for reduction of uncertainty in risk performance through time.



Groundwater properties impacted by CO₂ leakage

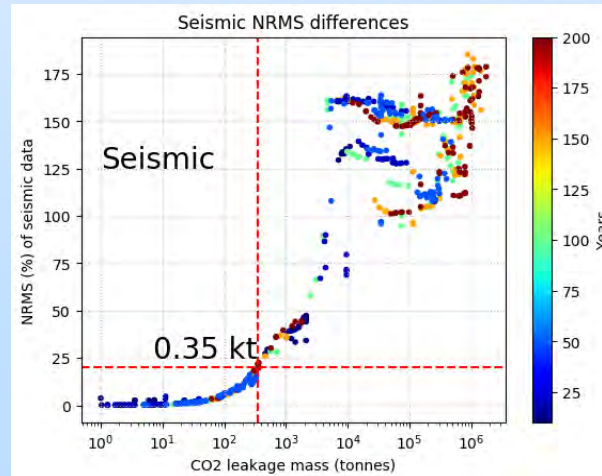
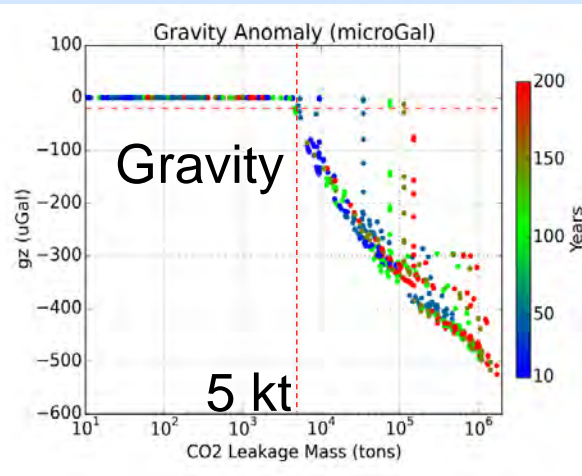
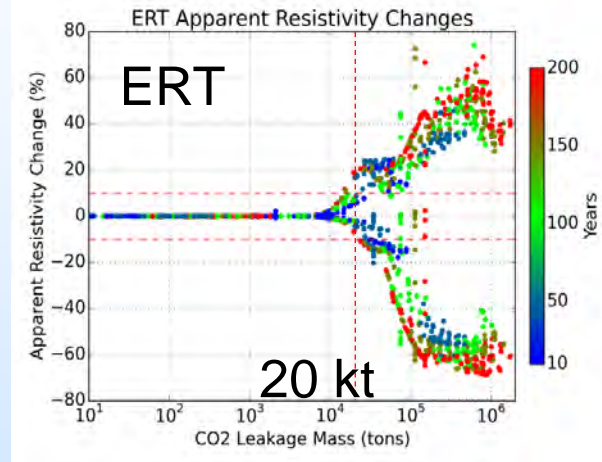
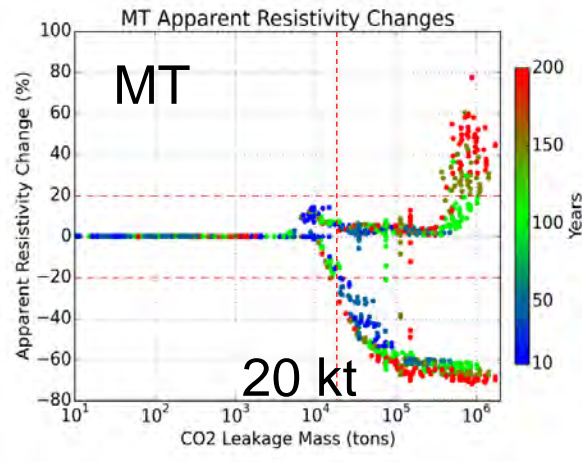
- pH
- Total dissolved solids (TDS)
- Pressure
- CO₂ saturation

Geophysical Monitoring of Brine and CO₂ Leakage through a Legacy Well into Shallow Aquifers (2)



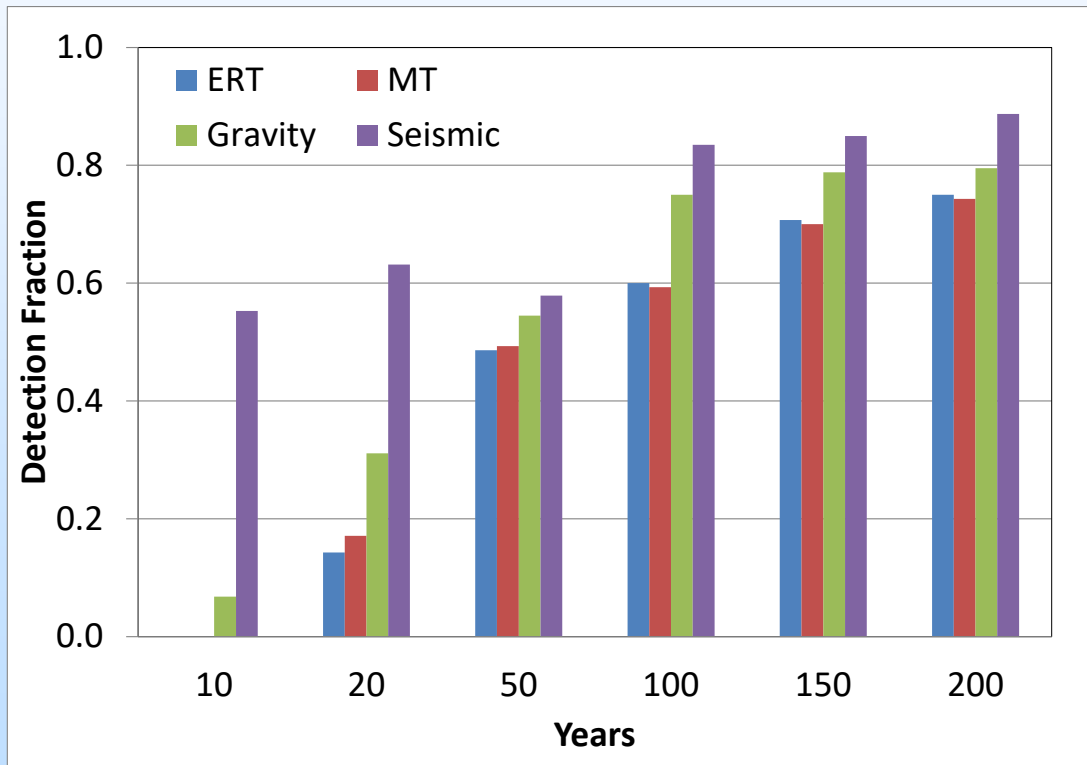
- Surface-based geophysical methods:
 - (a) electrical resistivity tomography (ERT)
 - (b) magnetotellurics (MT)
 - (c) gravity
 - (d) seismic methods
- 140 aquifer impact simulations at 7 time steps (0, 10, 20, 50, 100, 150, 200 years)
- 980 synthetic geophysical data sets per geophysical method were created

Geophysical Monitoring of Brine and CO₂ Leakage through a Legacy Well into Shallow Aquifers (3)



- There is a good correlation between the signal strength and CO₂ leakage mass
- ERT is sensitive to both resistivity CO₂ gas and conductive dissolved CO₂
- Seismic method can detect a CO₂ leak as small as 350 tons

Geophysical Monitoring of Brine and CO₂ Leakage through a Legacy Well into Shallow Aquifers (4)



- All four geophysical methods have more than 50% chance to detect a leak after 50 years
- Both seismic and gravity methods have better chance for early detection of a leak before 20 years

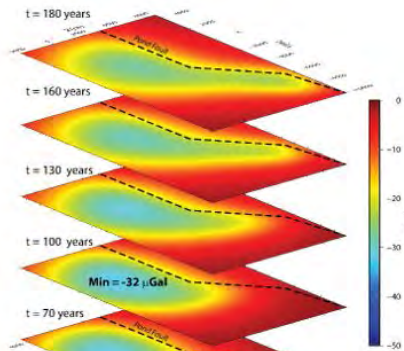
LLNL-PRES-752762

Time-lapsed gravity monitoring of CO₂ and brine leakage through a dipping fault

Delphine Appriou, Alain Bonneville, PNNL

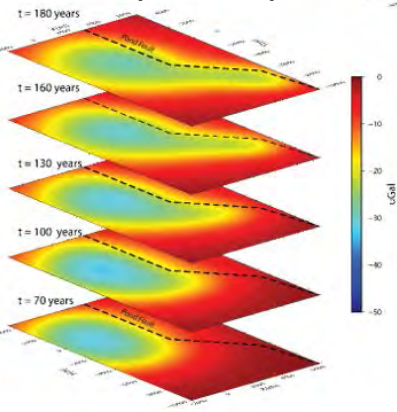
Surface Gravity Survey

Baseline



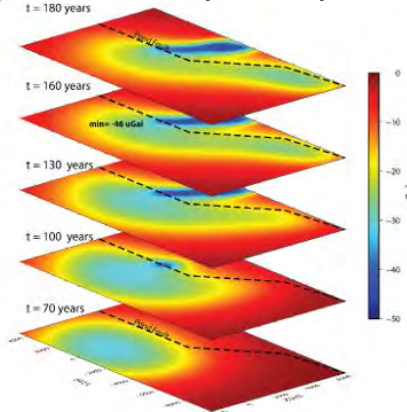
Surface gravity response detects CO₂ plume growth, migration and accumulation along a structural feature.

Leak 1 (~1500 m)



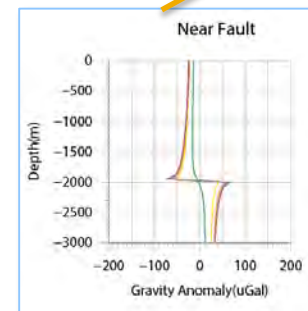
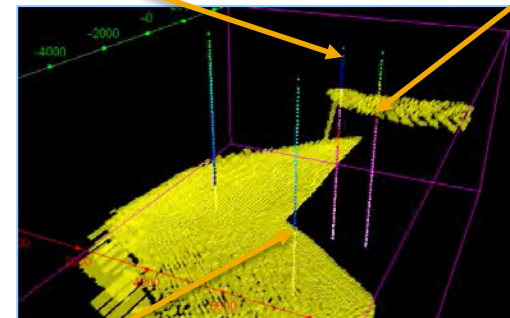
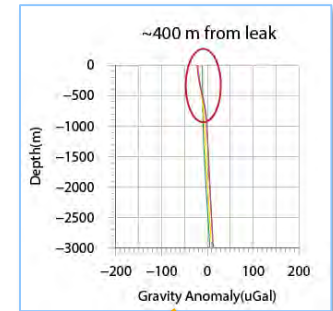
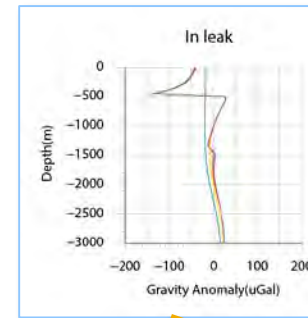
Leak too deep and mass too small to be detectable by a surface gravity survey only.

Leak 3 (~500 m)



Leak large and shallow enough to be detected by a surface gravity survey.

Borehole Gravity Survey



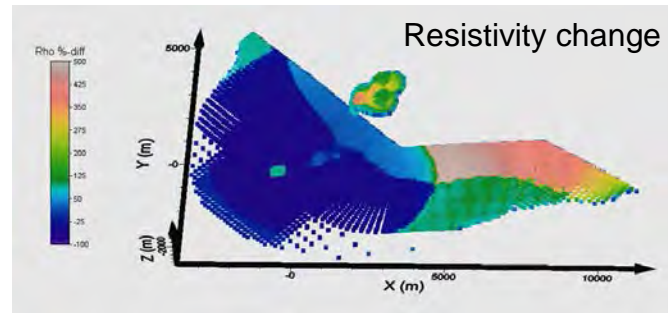
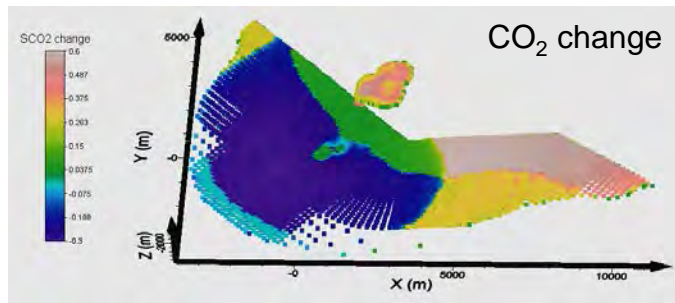
In addition to the location of CO₂ plumes and their evolution with time, gravity is the only method able to assess their masses.

Geophysical modeling of CO₂ and brine leakage through a dipping fault

Erika Gasperikova, Quanlin Zhou,
Thomas Daley, Curtis Oldenburg, LBNL

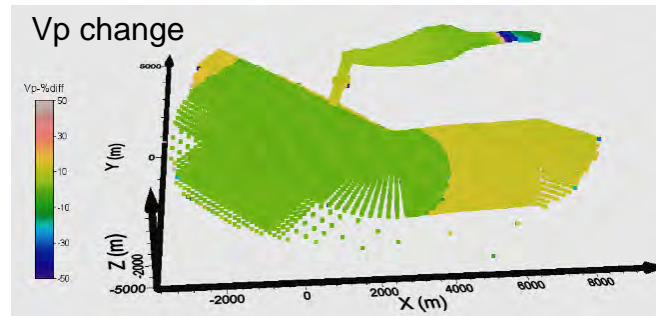
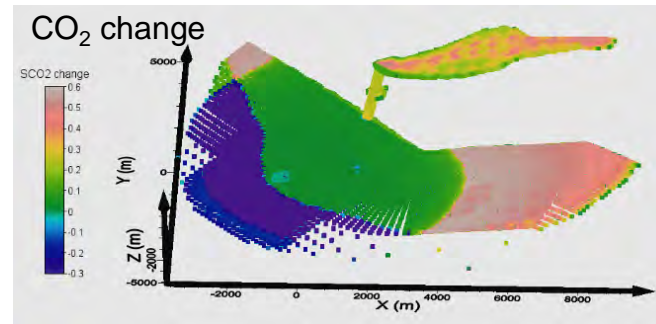
3D time-lapse monitoring

Resistivity/EM methods



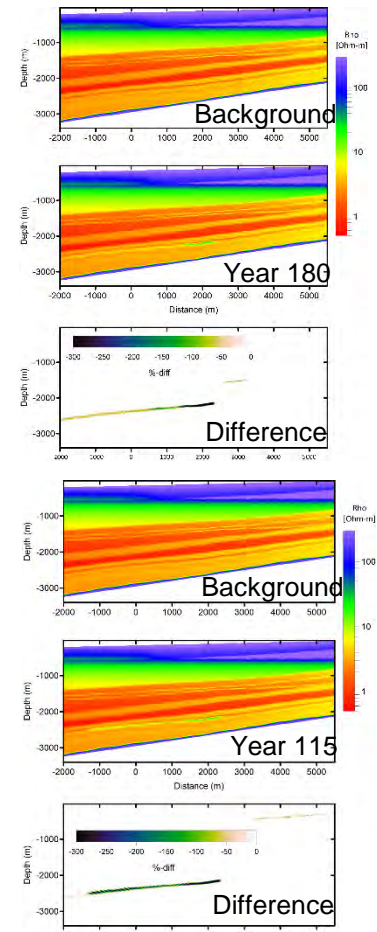
Leak at ~1500 m

Seismic methods



Leak at ~500 m

2D time-lapse monitoring

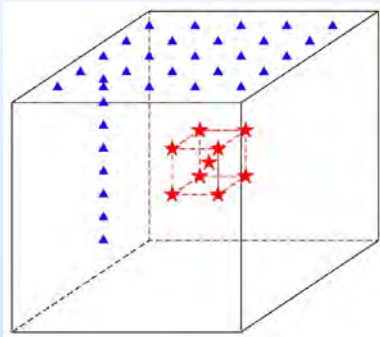


- CO₂ plume at ~1500 m depth grows slowly (1km²/50 years) and it's localized around the leak point
- CO₂ plume at ~500 m depth grows fast (triples in size every 5 years) and it follows geological structures

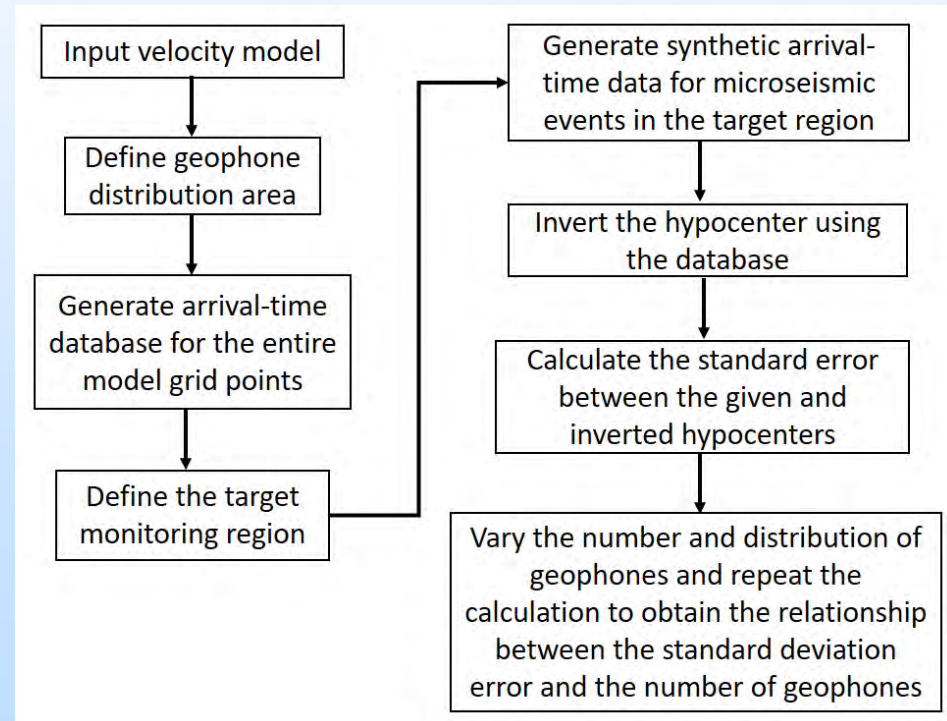
Tool for Optimal Design of Passive Seismic Monitoring Network

Yu Chen and Lianjie Huang, LANL

- Develop a tool to determine the relationship between the hypocenter uncertainty of microseismic events (**red stars**) within a target monitoring region (**red box**) and the geophone distribution (**blue triangles**).
- Design an optimal, cost-effective passive seismic monitoring network using this relationship.

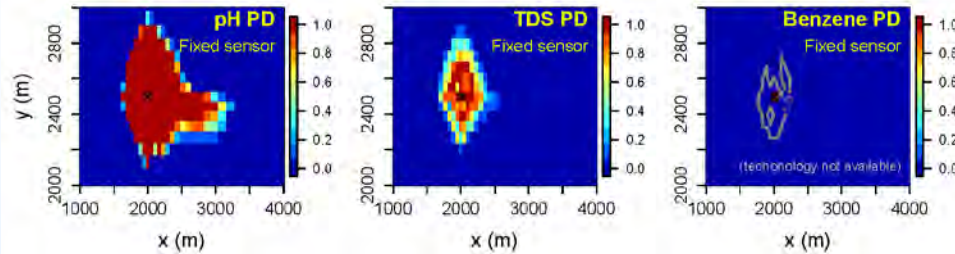


- Developed a fast-marching algorithm to calculate P- and S-wave arrival times.
- Developed a simulated heat-annealing method to search the best hypocenters through minimizing the arrival-time misfit between data and synthetics.



Risk-based Monitoring Assessment Methodology

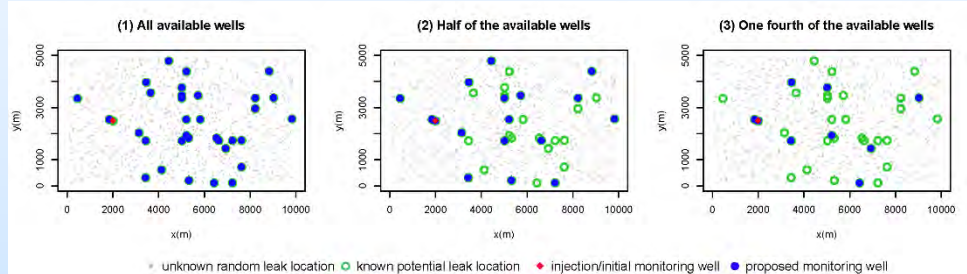
Ya-Mei Yang, Robert Dilmore, Grant Bromhal, NETL
Mitchell Small, Carnegie Mellon



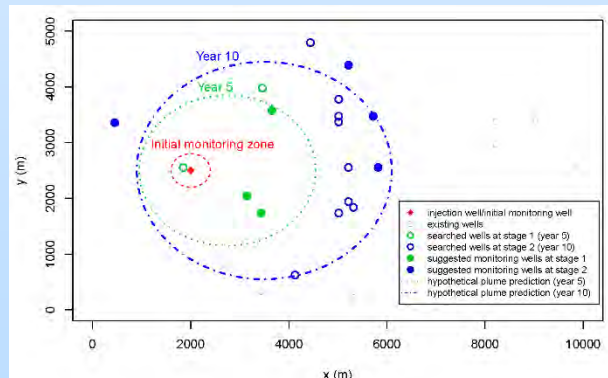
Toward an adaptive monitoring design for leakage risk – Closing the loop of monitoring and modeling

Ya-Mei Yang^{a,c,*}, Robert M. Dilmore^a, Grant S. Bromhal^a, Mitchell J. Small^b

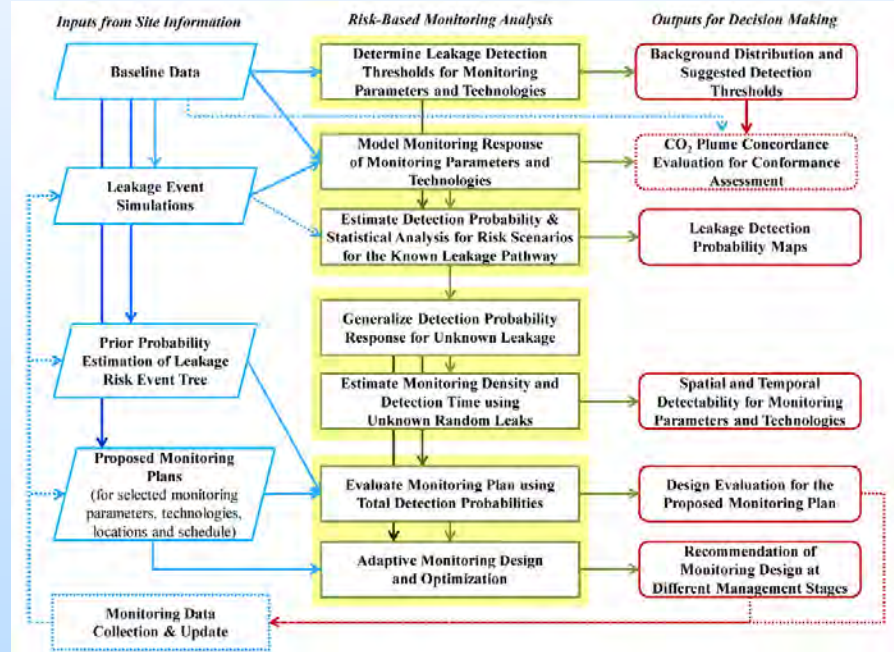
Probability of detection using monitoring response



Proposed monitoring well locations



Two-stage monitoring design solution

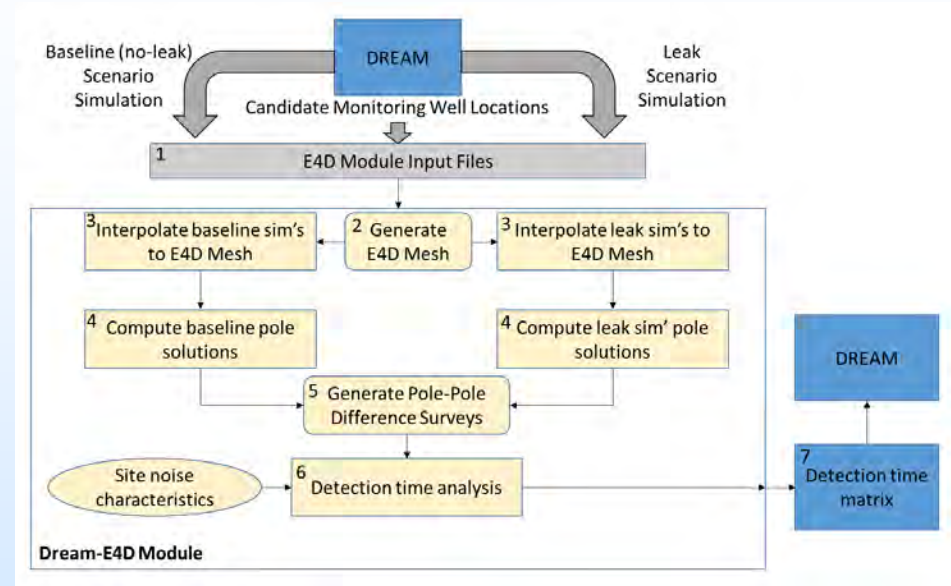
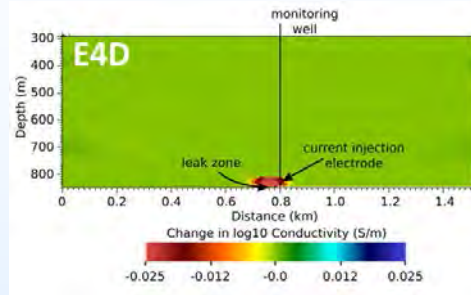


Risk-based monitoring design

Risk-Based Monitoring Network Design

Tools

Catherine Yonkofski, Timothy Johnson, Christopher Strickland, Jeffrey Burghardt, PNNL

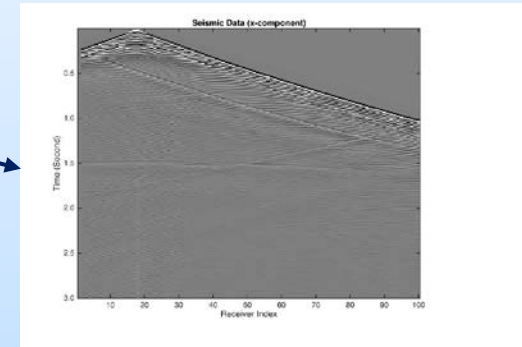
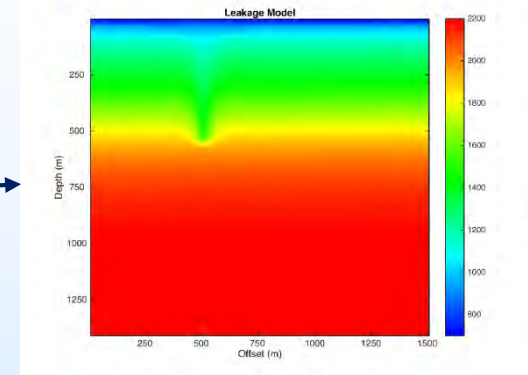
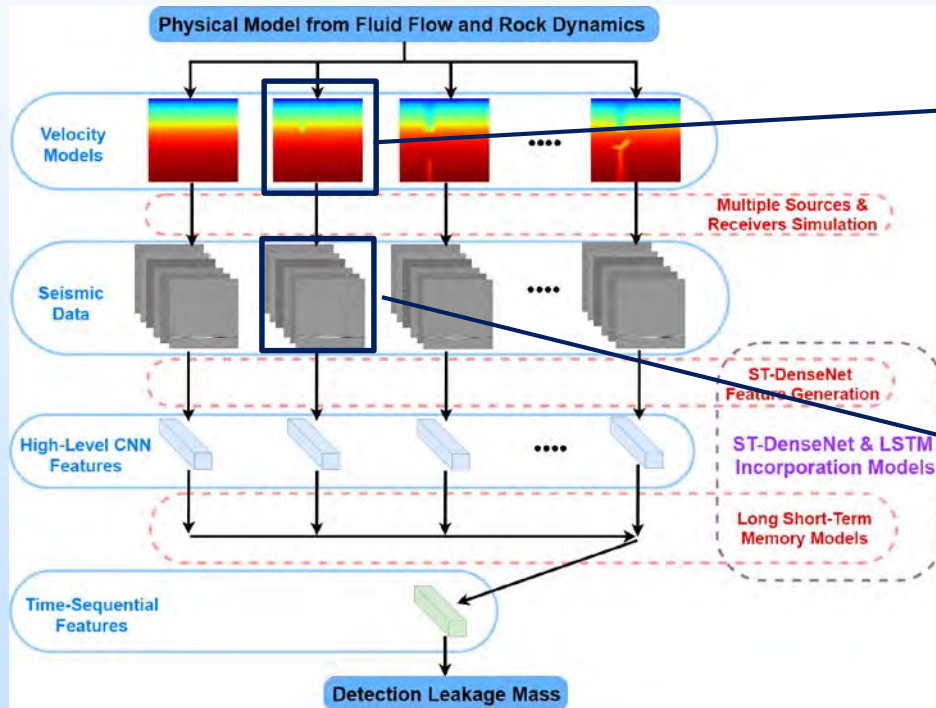


- DREAM v2 ERT module Beta released
- Considers both remote and point source monitoring parameters in a novel way
- More flexible user input including compatibility with OpenIAM output
- Improvement in memory usage for significantly faster data processing times
- Importance of evaluating detectability of monitoring technology with respect to leak magnitudes

Deep Learning Techniques to Detect CO₂ Leakage Using Seismic Data

Zheng Zhou, Youzuo Lin, Zhongping Zhang, Yue Wu, George Guthrie, LANL
Zan Wang, Robert Dilmore, NETL

Method



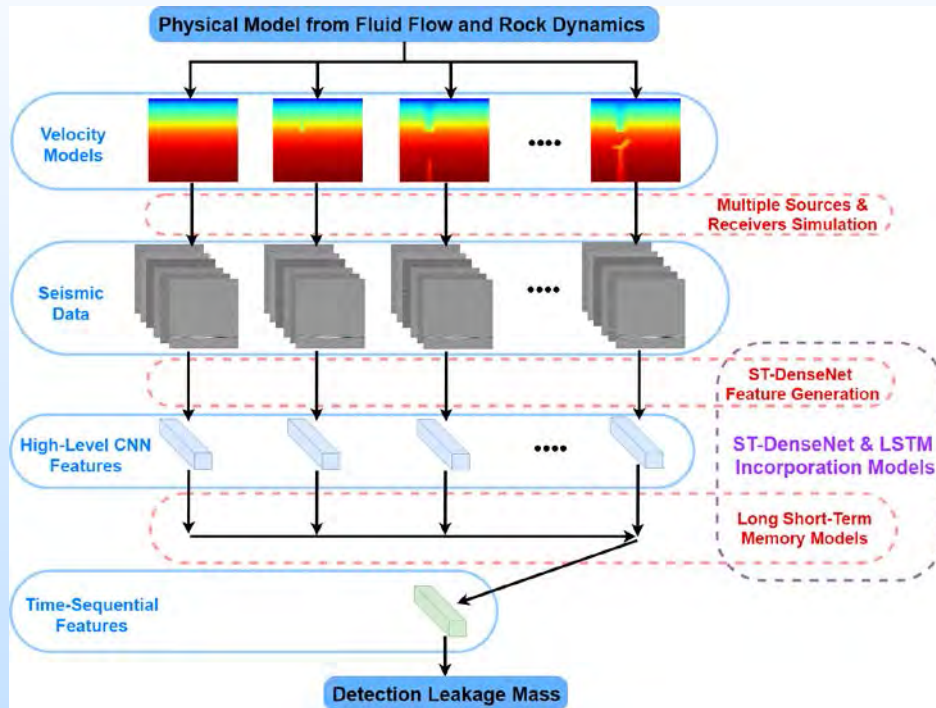
Zhou et al. (SEG, 2018), Zhou et al. (GJI, 2018)

- Build on deep neural networks to detect indirect physical changes caused by CO₂ leaks
- Combine 1D and 2D convolutional networks to account for both spatial and temporal information
- Incorporate long short-term memory (LSTM) to utilize time-sequential characteristics

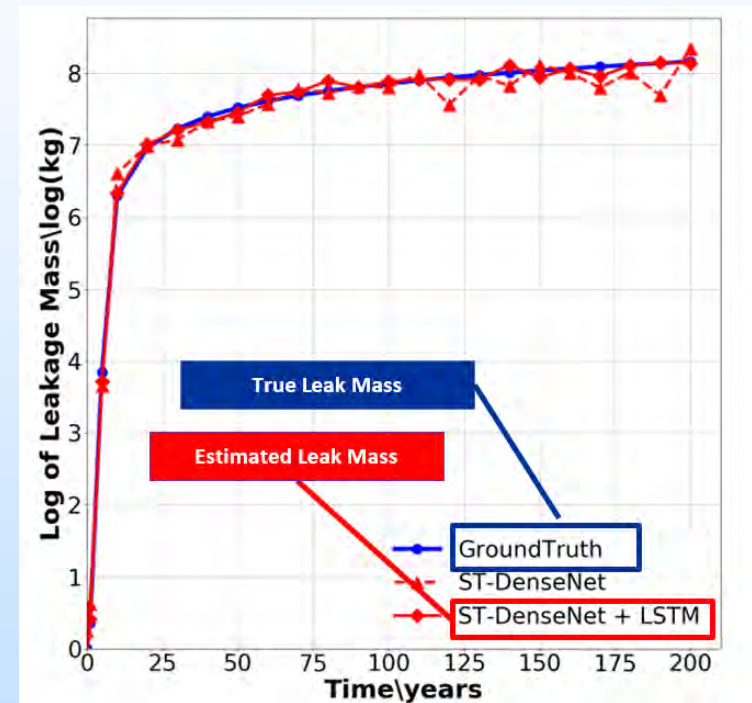
Deep Learning Techniques to Detect CO₂ Leakage Using Seismic Data

Zheng Zhou, Youzuo Lin, Zhongping Zhang, Yue Wu, George Guthrie, LANL
Zan Wang, Robert Dilmore, NETL

Method



Results



Zhou et al. (SEG, 2018), Zhou et al. (GJI, 2018)

- Build on deep neural networks to detect indirect physical changes caused by CO₂ leaks
- Combine 1D and 2D convolutional networks to account for both spatial and temporal information
- Incorporate long short-term memory (LSTM) to utilize time-sequential characteristics

Accomplishments to Date

- Four model datasets available for monitoring modeling – FutureGen 2.0, Kimberlina 1.1, 1.2, and Kimberlina 2
- Release of DREAM tool with E4D extension
- Report on geophysical techniques for CO₂ plume monitoring
- Report on effectiveness of multiple geophysical monitoring methods in detecting brine and CO₂ leakage in underground sources of drinking water
- Peer reviewed journal articles and presentations at scientific conferences

Future Work

- Continue with simulations of monitoring of modeling for various geophysical monitoring technologies
- Quantify the size of leak that can be detected and the earliest detection time for various monitoring techniques
- Develop prototype stochastic analysis based on a simple example case based on preliminary reduced-order model of monitoring
- Continued development of DREAM tool

Future Work

- Initiate consideration of how models of monitoring (numerical simulations or ROMs) can be used for design of monitoring networks for early detection of unwanted fluid migration
- Develop characterization of technical performance of monitoring technology detection thresholds, and attributes of spatial and temporal resolution
- Detectability maps of different monitoring technologies
- Establish conceptual framework for integration of multiple monitoring signals

Synergy Opportunities

- Noise levels from actual field data could be incorporated into modeling and improve statistical estimates of derived parameters
- Field data sets from active experiments could be used to test and verify monitoring approaches
- Developed codes and methodologies will be shared with other projects

Appendix

Benefit to the Program

- To develop a science-based method for quantifying the risks (and associated potential liabilities) for CO₂ storage sites and to develop efficient, risk-based monitoring protocols. The work is based on detailed multi-physics process models, coupled with reduced order modeling to facilitate stochastic analysis of risk and uncertainty.
- The development of monitoring approaches and risk assessment methodologies will lead to more efficient use of monitoring resources with risk reduction as an optimization metric.

Project Overview

Goals and Objectives

- Assess the effectiveness of monitoring methods to detect leakage, develop optimized cost-effective monitoring designs, and integrate monitoring into the IAM to reduce risk and uncertainty in risk.
- The integration will include feedbacks that allow a monitoring protocol to be influenced or driven by the IAM assessment of risks, as well as allowing the risk profiles to be modified by monitoring and mitigation. The influence of monitoring will be in identifying the need for mitigation (i.e., identification of leakage) and then the monitoring of mitigation to assess its success.

Milestones and Deliverables

- M1.17.4.A Report on initial selection of scenarios from Kimberlina impact models to be used for geophysical modeling
December 2017
- Release of DREAM tool with E4D extension - December 2017
- Estimate effectiveness of multiple geophysical monitoring methods in detecting brine and CO₂ leakage in underground sources of drinking water - June 2018
- Briefing to NRAP Stakeholder Group on progress and status of strategic monitoring task – August 2018
- D4.B Propose a conceptual design for effectively integrating geophysical models/monitoring technology characterizations into a risk assessment framework – December 2018

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- Wang, Z., Dilmore, R. M., Harbert, W. (2018). Forward modeling and stochastic inversion of time-lapse seismic data for assessing leak detection capabilities, submitted to the 2018 SEG Annual Meeting.
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- Yang Y.M., Dilmore R., Bromhal G.S., Small M.J. (2018). Toward an adaptive monitoring design for leakage risk – closing the loop of monitoring and modelling. *Int J Greenh Gas Control*, 76, 125-141.