### **National Risk Assessment Partnership**

NRAP leverages DOE's capabilities to help quantify uncertainties and risks necessary to remove barriers to full-scale CO<sub>2</sub> storage deployment.

#### Building toolsets and improving the science base to address...

- Potential impacts related to release of CO<sub>2</sub> or brine from the storage reservoir
  - Potential ground-motion impacts due to injection of CO<sub>2</sub>











#### **National Risk Assessment Partnership**

NRAP leverages DOE's capabilities to help quantify uncertainties and risks necessary to remove barriers to full-scale CO<sub>2</sub> storage deployment.

Building toolsets and improving the science base to address...

By simulating risk across the entire carbon storage system; And generation thousands of realizations to quantify uncertainties.



## Broad knowledge base provides foundation for confidence in long-term geologic storage security.



Schematic evolution of trapping mechanisms over time (IPCC, 2005)



IPCC (2005)

"Observations from engineered and natural analogues as well as models suggest that the fraction retained in appropriately selected and managed geological reservoirs is very likely to exceed 99% over 100 years and is likely to exceed 99% over 1,000 years."



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#### What do we know?

#### Multiple trapping mechanisms reduce CO<sub>2</sub> mobility over time

 structural/stratigraphic; residual; solubility; mineralization; sorption

#### Risk profiles should decline over time

#### Broad experience base for effective sitecharacterization & operational strategies

- Decades of successful operational experience (e.g., EOR, gas storage, ...)
- RCSPs & DOE Best-Practices
- Early successes with large-scale field demos (e.g., Sleipner, Weyburn)





## Science-based prediction can build confidence in expected storage security by quantifying system performance for a range of conditions.



NRAP Goal—to predict storage-site behavior from reservoir to receptor and from injection through long-term storage...

...in order to quantify key storage-security relationships for various site characteristics.



#### Confidence in uncertain predictions can be built through comprehensive, multiorganizational team assessments.



NRAP is building and applying computationally efficient tools to probe site behavior stochastically, thereby accounting for uncertainties and variability in storage-site characteristics.







## What information is needed to provide the confidence necessary to consider an alternative approach to PISC monitoring needs?



A reduction of 1-2  $\pm$  ton CO<sub>2</sub> would mean a savings of 50-250 million per project.







## NRAP's approach to quantifying performance relies on reduced-order models to probe uncertainty in the system.









#### **Key NRAP Accomplishments: Building the Toolsets**

- First-of-a-kind toolsets for science-based, quantitative evaluation of risks and uncertainties
  - Leakage risks (reservoirs to receptors)
  - Induced seismic events
- Site-specific and adaptable ROMs
  - Reservoirs (3 classes; 3 injection scenarios)
  - Wellbores (open and cemented)
  - Fractures (discrete and networks)
  - Aquifers (two major types)
- Evaluated numerous approaches to reduced-order models (lookup table to artificial intelligence)
  - Achieve balance between fidelity and speed







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# Several NRAP products will be released for use in August 2015.

- Integrated Assessment Model CO2-PENS
- Reservoir Analysis Tool
- Wellbore ROM Tool
- NSealR Model
- Coupled High Plains Aquifer Tool
- Coupled Edwards Aquifer Tool
- Simulation Tools for Optimization and Risk Management (STORM)
- Empirical Seismic Hazard Analysis Tool
- Probabilistic Seismic Risk Assessment Tool (RISKCAT)
- Ground Motion Predictive Tool

## www.edx.netl.doe.gov/nrap







## CO2-PENS simulates models carbon storage system behavior.

#### • Simulates the entire storage containment system

- Reservoir
- Wellbore and fracture flow
- Thief zones
- Groundwater aquifer
- Release to atmosphere
- Calculates probability of leak events
  - For threshold values of choice
  - Over 100s to 1000s of years
- Thousands of runs to quantify uncertainty
- First quantitative risk profiles with realistic storage conditions

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# Many system-wide variables can be studied to determine impact on risk.

- Importance diagrams identify parameters that do and don't have an impact on leakage
- Can evaluate impacts in any part of the storagecontainment system
  - E.g., on average, leak rate depends on residual saturation
  - E.g., wellbore transmissivity statistics influence parameter ranking
- Greenfield vs. brownfield conditions influence likelihood of failure
  - Open wellbores significantly increase risk









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# The reservoir analysis toolkit is used to track performance metrics for reservoirs.



- Produces simple metrics from reservoir simulations that can be used to evaluate reservoir performance as it relates to risk.
  - Takes in Pressure and Saturation values output from simulation software (modular design accommodates different file types).
  - Outputs plume sizes through time and pressure values in specified grid blocks at each time step.







#### $\Delta$ Pressure plume size for 0.1MPa 4.5 le9 at time 0.0 years 1.0 0.9 100000 4.0 0.8 3.5 0.7 80000 3.0 0.6 2.5 0.5 60000 2.0 0.4 1.5 0.3 40000 1.0 0.2 0.5 0.1 20000 0.0 0.0 200 600 800 1000 10000 20000 30000 40000 50000 60000 70000 400 Saturation plume size for 0.2 at time 0.0 years 1.0 le8 1.0 0.9 100000 0.8 0.8 0.7 80000 0.6 0.6 0.5 60000 0.4 0.4 0.3 40000 0.2 0.2 0.1 20000 0.0 0.0 200 400 800 1000 10000 20000 30000 40000 50000 60000 70000 'n 600

## Addresses multiple simulations probabilistically.

 Colors based on likelihood of exceeding user-defined thresholds in each grid block







### **Using Science-Based Prediction to Probe Reservoir Behavior: Metrics Analyzed**

#### • Size of CO<sub>2</sub> plume injection

- > Rate of growth for early phase
- > Rate of growth for long-term phase
- > Plume radius at end of injection

#### • Size of pressure plume

- > Maximum size of plume
- > Various pressure thresholds, relevant
  - $\geq$  Brine rise
  - > Fault-slip criteria

#### Pressure at a location

> Maximum pressure increase





Size of Pressure Plume

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Pressure at at a Location

Ref: Bromhal et al, NRAP-TRS, 2014



# Growth of CO<sub>2</sub> plume has a characteristic behavior, albeit details vary between sites.









# Amount of CO<sub>2</sub> injected is primary factor in the growth rate and size of CO<sub>2</sub> plume.









# Growth of pressure plume has a characteristic behavior, albeit details vary between sites.





Unbound Sandstone, Regional Dip (0° dip)









#### Amount of CO<sub>2</sub> injected and geologic details each impact the area/distance for pressure effects. Unbound Sandstone,



- of pressure effects for a given threshold
- > Decreasing permeability can significantly increase distance (or size) of pressure effects

geological

**U.S. DEPARTMENT OF** 

> Increasing the permeability can dramatically decrease distance (or size) of pressure effects

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## **General Observations**

#### **Two questions**

- > How does reservoir performance change as a function of injection volumes & rates?
- > How does a reservoir respond as a function of time when injection stops?

#### Impact of operational variables...

- Reservoir response varies with amount of injected CO<sub>2</sub>
  - 1. Size of  $CO_2$  Plume—rapid growth during injection; slower growth post injection
  - 2. Size of Pressure Plume—rapid growth during injection; reaches maximum and decays post
  - 3. Change in Pressure over Time—rapid growth during injection; rapid decline post injection
- Potential to exceed some pressure thresholds depends on size of injection

#### Impact of geologic variables...

- Reservoir response varies with geologic type
- Rate of CO<sub>2</sub> plume growth depends on reservoir porosity
- Potential to exceed some pressure thresholds depends on reservoir permeability

#### Impact of geologic variables is on the same order as operational variables.







## **Induced Seismicity**

#### **Tool & Method Development**

- Developed a probabilistic seismic hazard assessment (PSHA) tool for induced seismicity
  - adapted widely accepted conventional PSHA approach
- Extending development to assess damage and nuisance (felt event) risks
  - demonstration application to realistic CO<sub>2</sub> injection scenarios based on In Salah (Algeria)

#### **General Trends & Relationships**

- Rates of occurrence and sizes of earthquakes are determined by tectonic stress and reservoir pressure
  - sensitive to fault permeability and a few key parameters in the law governing the evolution of fault frictional strength
- Risk of CO<sub>2</sub> leakage may be coupled to slip on faults during earthquakes













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## High costs and large uncertainties suggest a phased approach to seismicity management

Phase		Characterization & Monitoring	Modelling	Risk Assessment
•	Site-screening	<ul> <li>Regional stress estimates</li> <li>Fault density estimates</li> </ul>	<ul> <li>Back-of-the- envelope</li> </ul>	<ul><li>Red-flags</li><li>Atlas</li></ul>
•	Pre-injection	<ul> <li>3D seismic</li> <li>XLOTs</li> <li>FMI</li> <li>Limited microseismic</li> </ul>	Simple models	<ul> <li>Qualitative Assessments</li> <li>PSHA</li> </ul>
•	Injection & PISC	<ul><li> 4D seismic</li><li> Full microseismic</li></ul>	<ul> <li>Sophisticated models</li> </ul>	<ul><li>Traffic-light</li><li>PSRA</li></ul>

-- Cost/benefit of additional methods assessed based on evolving project conditions.

- -- Baselines are important.
- -- Timely processing and interpretation of data are important.







# Empirical short-term forecasting tool helps determine risk of induced seismicity.



- Based on Gutenburg-Richter and
   Omori laws
- Originally an aftershock models
- Reads a seismic event catalog

- Typically used for a window of a few days.
- Would complement a stoplight protocol
- Forecasts seismic frequency

Ref: Bachmann et al, 2014







## NRAP future focus is on the incorporation of monitoring and mitigation.

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- **Optimizes subsurface monitoring** . design for a specified CCS site
- Finds monitoring design that yields • minimum expected time to first detection of CO<sub>2</sub> leakage (E[TFD])
  - Subsurface monitoring design includes well locations and type/depth of sensors deployed in each well
  - Subject to constraints like budget, number of wells, physical limitations
- Uses a collection of subsurface realizations
- User defined alarm and inference • criteria
  - What causes sensor to alarm
  - How many sensors imply a leak
- Uses simulated annealing to check for • optimum design





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## Thank you.

#### NRAP Products for planned August release.

- Integrated Assessment Model CO2-PENS
- Reservoir Analysis Tool
- Wellbore ROM Tool
- NSealR Model
- Coupled High Plains Aquifer Tool
- Coupled Edwards Aquifer Tool
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- Empirical Seismic Hazard Analysis Tool
- Probabilistic Seismic Risk Assessment Tool (RISKCAT)
- Ground Motion Predictive Tool

#### More information at:

## www.edx.netl.doe.gov/nrap









## **NSealR** Computer Code

- Computes two-phase (brine and supercritical CO<sub>2</sub>) flow and Includes fluid thermal/pressure dependence
- Module to compute leakage through a Barrier (Seal) Layer
- Uses inputs of pressure and saturation at the reservoir/seal interface
- Various levels of complexity to model barrier response
- Accounts for effective stress dependence of aperture



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## Wellbore ROMs address vertical migration for a variety of conditions.

- Models migration of brine and/or CO<sub>2</sub> outside of storage reservoir
- Inputs of reservoir pressures and saturations
- Predicts flowrate into thief zone and groundwater aquifer
- Incorporates chemistry to identify flowrate changes as a function of time









### **Groundwater ROMs predict volume of aquifer impacted.**



- Shallow aquifer pH plume volume, considering uncertain aquifer parameters and leakage scenarios
  - Note higher uncertainty for small leaks
- Inputs migration rate and concentrations from wellbore or similar models
- Includes two different end member aquifer types
- Incorporate flow and chemistry
- Metrics include: pH, TDS, metals concentrations, organics concentrations







# Other preliminary induced seismicity codes incorporate seismic hazard and ground motion.



- Uses probabilistic seismic hazards assessment (PSHA)
- Incorporated multiple sources and ground motion realizations
- Coupled hydro-mechanical modeling
- Injection-induced incremental hazard is calculated







## **Initial Reservoirs for AoR and PISC Studies**



- Unbound Sandstone Reservoir
  - Sandstone formation
  - > No lateral structural trap
  - > Horizontal or dipping units bound by caprock
  - > Homogeneous, moderate permeability
- Based on generic reservoir off structure
  - > Initial geologic model developed in TOUGH2
- Single, vertical injector
  - > Perforated along entire reservoir interval
  - Constant-rate injection
  - Varying Injection Rates
  - Varying Injection Times
  - Post Injection: Monitoring pressures and CO2 at various time points



- Domal, Multilayer Sandstone Reservoir
  - > Multilayer sandstone formation
  - > Domed structural bound by shale caprock
  - > Heterogenous, variable layer permeability
- Based on candidate site from RCSP, ARRA
  - > Citronelle-like conditions in reservoir
  - Initial geologic model leveraged from RCSP and ARRA project and developed in CMG
- Single, vertical injector
  - > Multiple perforations along reservoir interval
  - > Constant rate injection with pressure constraint
  - Varying Injection Rates
  - Varying Injection Times

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 Post Injection: Monitoring pressures and CO2 at various time points







#### NRAP Value Proposition 1:

## Science-based prediction can build confidence in expected storage security by quantifying system performance for a range of conditions.



NRAP Goal—to predict storage-site behavior from reservoir to receptor and from injection through long-term storage...

> in order to quantify....in order to quantify. key storage-security relationships for various site characteristics.

> > Metric Tons CO,





### • Storage-security relationships are a function of the behavior of the coupled storage-site system

- reservoir behavior (e.g., evolution of CO<sub>2</sub> & pressure plumes)
- nature of seal and potential fastpaths (e.g., fractures, wells)
- response of receptors (e.g., aquifer)

#### Storage-site characteristics vary & are incompletely known

• uncertainty in characteristics leads to uncertainty in behavior

#### **Approach to Development of Reduced-Order Models (ROMs):** Case Study at a Candidate Field Site



from Wainwright et al. (2012) NRAP-TRS-III-002-2012

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