Chemically Enabled CO<sub>2</sub>-Enhanecd Oil Recovery in Multi-Porosity, Hydrothermally Altered Carbonates in the Southern Michigan Basin

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Program Overview, Goals, and Objectives

- Technology Background
- Technical Approach
- Progress and Current Status of Project

Plans for Future Testing/Development/Commercialization

>Summary



## **Project Overview**

- Project Cost:
  - DOE Funds- \$7,999,659
  - Cost Share- \$2,153,668

- Total Cost- \$10,153,327
- Period of performance: October 2019-March 2024



#### **Project Goals and Objectives**

 Carry out a comprehensive laboratory experiment, computer modeling, and field testing-based evaluation of chemically enabled CO<sub>2</sub>-EOR in the Southern Michigan Basin conventional Trenton/Black River play to optimize recovery in a complex, multi-porosity, hydrothermally altered carbonate





#### **Project Setting- Significant Oil Potential**



#### **Project Setting- Complex Carbonate System** Trenton Leached limestone (vugs form) (argillaceous at base)

- Facies heterogeneity
- Dolomitization from hydrothermal fluids
- Zones of enhanced porosity and permeability from vugs and fractures



Continued

transtensional

(A) Strike-Slip Away

C) Faulting continues (Utica deposition); hotter fluids

Limestone

#### **Albion-Scipio Field Information**

Depth	OOIP	Total Production	Discovery Pressure	Current Pressure	Avg. Porosity	Avg. Permeability
3,550-4,000 ft	290 MMBO	135 MMBO	1593 psig	100-150 psig	4.8%	84.5 mD

dolomitize leached matrix

Basement

Shale

T Strike-Slip Toward



T

A

A

D) Faulting continues (Utica, later?); Matrix fractured,

Sandstone

vugs, breccias and fractures filled with saddle, etc.

Basement

Dolomite

Reactivated as

transtensional

fluids remain

hotter longer

Continued

transtensional

Fluid Flow

Smith,2006

cooling

#### **Project Setting - Rich, Extensive Database**

- Detailed, digitized well records for all wells in the field
  - Construction, plugging, logging, etc.
- Digitized wireline log data for 1000+ wells
- Custom porosity & lithology logs for all wells in study area
- 13 mi<sup>2</sup> high resolution 3D seismic covering study area
- Core measured data available for ~60 wells across the TBR in Michigan
  - Porosity and permeability
  - Thin sections



### **Technical Approach**





#### **Project Success and Impacts**

- We anticipate the following key outcomes and impacts:
  - First-of-a-kind comprehensive database and TBR characterization in southern Michigan
  - Understanding of the distribution and extent of vugs and fractures in the TBR reservoir using traditional ML and deep learning techniques
  - Laboratory experiment driven improved design of chemically-enabled CO<sub>2</sub> EOR which targets multi-porosity, complex carbonate reservoirs and improves flood efficiency
  - Modeling and field testing-based evaluation of the viability of chemically CO<sub>2</sub>-EOR for stranded oil recovery in the TBR & similar HTD plays, along with field development plan.
- EOR advancements in the TBR in southern Michigan would be applicable to numerous fields and improved methodologies for enhancing oil recovery in complex carbonate systems.
- Project funding will initiate CO<sub>2</sub>-EOR infrastructure in the Midwest, which will also lay the groundwork for future work and demonstrate the path forward in reevaluating historical plays.
- This work will greatly benefit local oil and gas operators, CO<sub>2</sub> emitters and providers, and other industrial businesses.



#### **Progress and Current Status**

#### Task 2- Machine Learning Integrated Geologic Characterization

- Data collection, cleaning, and analysis→ integrated database
- Core workshop
- Development of petrophysical workflows
- Preliminary 3D seismic analysis
- Risk Assessment over AOI
- Development of data cleaning and exploration workflows
- Preliminary machine learning applications and results

#### Task 3- Laboratory Studies of Chemically Enabled CO<sub>2</sub>-EOR

- Collection of oil samples from analog wells
- Review of existing PVT data
- Minimum miscibility pressure tests
- Chemical additive screening



#### **Data Compilation**

- Focused on three main fields: Albion-Scipio, Stoney Point, and Napoleon
  - Albion-Scipio is the location of field test while Stoney Point and Napoleon are great analogs with modern data





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### **Data Compilation**

#### Central Albion-Scipio Field Log and Core Coverage



## **Core Workshop**

- Examined 13 wells with core data
- Compared to facies descriptions, logs, and measured porosity/permeability
- Developed guidelines for consistent formation picks
- Began catalog of observable features (vugs, fractures, lithology, etc)





## **Depth Correction**

- Correcting core depth to log depth for reliable correlations
- Example well shows improved correlation from .0004 to .85 by shifting depths by 7 feet
- Core data will be used in machine learning applications to better predict reservoir properties





#### **Petrophysical Calculations**

- Finalized Vshale, effective porosity, and water saturation
- Applying permeability bulk transform from core, and Timur method of estimating permeability from logs



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## **Seismic Analysis**

- Preliminary analysis completed including:
  - Well ties
  - Horizon mapping

- Attribute analysis
- Fault identification
- Inversion



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#### **Seismic Analysis**

- >50 faults interpreted in the volume
  - Few large faults with several smaller faults







#### **Risk Assessment- Wellbore Integrity**





## **Risk Assessment- Site Risk Screening**

 Features, Events, and Processes (FEPs) review and activitybased analysis of project tasks

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- No significant items found that would affect system safety/performance
- Wellbore integrity, geomechanical issues, and injection performance due to fractures highlighted
  - No extremely high- or high-risk scenarios identified
  - Typical oil field risk items which can be mitigated through safe drilling practices



#### **Risk Assessment- Geohazards Analysis**

- Review of environmental areas and potential geohazard risks such as seismicity and geomechanics
- Test area is mostly cropland, pasture, and mixed with forest and wetlands.
- Fractured reservoir has geomechanical risks which will be considered during modeling





#### **Data Analytics & Machine Learning**

- Objective: Integrate multiple data types to predict key reservoir properties such as porosity, permeability, and fractures.
  - Defining reservoir facies experienced based reservoir facies have traditionally been applied to interpret the TBR. ML techniques, such as principle component analysis and cluster analysis will be used to identify and predict statistically significant facies at all well locations
  - Developing correlations and predictive model for acoustic properties-Vintage log data only records Vp, so laboratory measurements will be used to develop correlations between Vs and Vp to predict Vs from vintage acoustic logs
  - Identifying fracture network: Deep learning methods will be used to train and identify fractures and faults on 3D seismic slices to develop a full fracture network across the study area. In the absence of seismic data, ML methods will be used to predict fractures from available wireline log data



#### Machine Learning Filling in Missing Values (Data Imputation)

- Values for missing data are inferred using kNN (nearest neighbor interpolation with a moving window)
- The distributions of the imputed and observed values are consistent as shown in the histogram and CDF plots
- This creates a rich data set where all of the samples can be utilized for identifying electrofacies or building predictive models





# Machine Learning

#### **Cluster Analysis to Define Electrofacies**







## **Machine Learning**

**Cluster Analysis Geologic Validation** 

- Cluster 3 (orange) correlates with shaley intervals
- Cluster 2 and 4- tight limestone
- Cluster 0- moderate porosity (blue)
- Cluster 1- high porosity (green)





#### Task 3 MMP Test

- Minimum Miscibility Pressure (MMP) test parameters:
  - Type Slim tube
  - Diameter: 0.26 in
  - Length: 20 ft
  - Porosity: 37.4%
  - Sand Mesh: 100-150
  - Temperature: 40°C
  - Pressure: 1000-3000 psi
  - Flow rate: 0.014 ml/min
  - Injection volume: 1.2-1.3 PV







#### **MMP Results**



9/15/2020



### **Task 3 Chemical Additive Screening**

- Sasol conducted testing of the crude oil for chemical additives
  - Identified two potential additives Soloterra ME-1 and ME-2 for further testing with UT





#### **Task 3- Testing Chemical Additives**

- UT also tested Sasol's Soloterra 843 as a foaming agent (surfactant plus brine)
- Produced stable foam with a half-life of 0.5 hours
- Foam stability increased with salinity (desired)
- Half-life was higher at higher salinities (desired)
- Addition of oil didn't impact foam stability vs. salinity (positive sign)





#### Plans for Future Testing/Development/Commercialization

- Drilling of the monitoring/production well
  - Will collect modern logs, core samples, oil samples, and baseline monitoring data
- Preparing for field injection test
  - Develop plans/permits/etc to drill injection test well near the monitoring/production well
  - To be conducted in BP2
- Evaluation of test success and impact it could have on Albion-Scipio field
- Evaluation of potential impact on multiple TBR fields
- Integration of results into development plan



## **Project Summary**

- Experienced unexpected delays due to changes in oil prices and COVID-19
- Project remained on track and focused on database compilation, analysis, and machine learning workflows
  - Extensive database of well information, wireline logs, core data, historical records, maps, etc
  - Workflows in place for consistent and efficient analyses
- Monitoring/production well to be drilled by end of the month





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### Appendix



#### **Project Team**





#### Project Schedule and Deliverables

- 3, 18-month budget periods spanning 4.5 years
- 8 tasks

Budget Period			E	31					В	B2					В	3		
TASK/SUBTASK $\diamond$ Milestones $\diamond$ Deliverables			20	)		FY	21			FY	22	2		FY	23		FY	24
TASK 1 - Project Management and Planning	٠	•				•		٠		•	•	•		•		٠	٠	
1.1 - Project Tracking and Controls																		
1.2 - Project Planning				$\top$	$\square$	$\square$				$\square$								
1.3 - Progress Briefings and Presentations				$\top$						$\square$								
1.4 - Technology Transfer				$\top$						$\square$								
TASK 2 - Machine Learning Based Data Integration				Γ		•												
2.1 - Data Compilation, Review and Analysis																		
2.2 - Risk Assessment	Π							$\diamond$										
2.3 - Advanced Field Characterization	$\square$	≯																
2.4 - Integrated Physics-Based Machine Learning							Ь											
TASK 3 - Laboratory Experiments																		
3.1 - Core Characterization	4																	
3.2 - MMP Determination																		
3.3 - CO <sub>2</sub> Core Flooding							Ш											
3.4 - CO <sub>2</sub> Foam Flood																		
3.5 - Lab-Scale Compositional Modeling							Þ											
TASK 4 - Design and Simulations of Injection Scenarios								•										
4.1 - Development of Static Earth Models							$\diamond$											
4.2 - Upscaling and Ranking of SEMs																		
4.3. Material Balance Study																		
4.4. Dynamic Simulations and Analysis						4	$\mathbf{\cdot}$											
TASK 5 - Field Injection Tests												$\blacklozenge$	h					
5.1 - Site Preparation-Drilling, Well Completions, and Plans				$\perp$									$\square$					
5.2 - Baseline Characterization and Monitoring												$\diamond$	$\square$					
5.3 - Injection Operations												$\diamond$	¥					
TASK 6 - Production Monitoring												Lr						•
6.1 - Fluid Sampling												$\square$						
6.2 - Fluid Flow				$\perp$								$\square$						
6.3 - Pressure Analysis				$\perp$	$\vdash$							$\square$						
6.4 - Tracer Analysis												$\square$						
6.5 - Integration of Monitoring Technologies												LL.						
TASK 7 - Performance Assessment																		٠
7.1 - Performance Assessment					1	<u> </u>				$\vdash$		Ц.						
7.2 - Modeling Update and Scale Up				_	1	<u> </u>				$\vdash$		$\square$						
TASK 8 - Development Plan																		•
8.1 - Economic Assessment																		
8.2 - Development Strategy Plan												9			-045		000	41.10



#### Project Risks

- Familiar with project risks and mitigations from previous project experiences
- Low to medium overall risks
- Multiple contingency plans to ensure project success

	Risk rat	ing		
Perceived risk	Probability	Impact Overa		Mitigation/response strategy
Financial risks	Low, Med, H	lign)		
Field costs	М	М	М	Closely monitor field costs to stay within budget and scope
Cost share	L	L	L	Provide well use cost share; existing well and new wells planned, additional cost share available
Cost/schedule risks:				
Well availability	L	Н	L	Engage committed operator: Innova Exploration
CO <sub>2</sub> source arrangements	L	Η	М	Work with experienced and available vendor for CO2 sourcing
Operator schedule	L	М	М	Coordinate with operator; provide large time span for testing
Technical/scope risk	ks:			
$CO_2$ injectivity in the TBR	e M	Н	М	Conduct core analysis and injection simulations; side-track well as needed; prolong test
Inability to fully monitor CO <sub>2</sub> flood	М	М	М	Deploy multiple monitoring methodologies
Lost circulation and wellbore integrity	L	М	L	Use comprehensive field characterization and well construction and completion plans
Management, plann	ing, and over	sight risk	s:	
Managing field work schedule, vendors, supplies	М	М	М	Work with operator to streamline field work



#### Machine Learning Data Imputation – Comparison of Methods

Boxplots highlighting the D-statistic using several machine learning models to impute data (note: the rightmost boxplots use an iterative process to impute data, the left boxplot is filling in points by using the k nearest points utilizing a distance metric which accounts for missing data). The points in each boxplot are the D-statistic as a function of selected hyperparameters for each model.



