

# Fracture Network Quantification for Enhanced Reservoir Characterization in CO<sub>2</sub> Storage Sites



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# Disclaimer

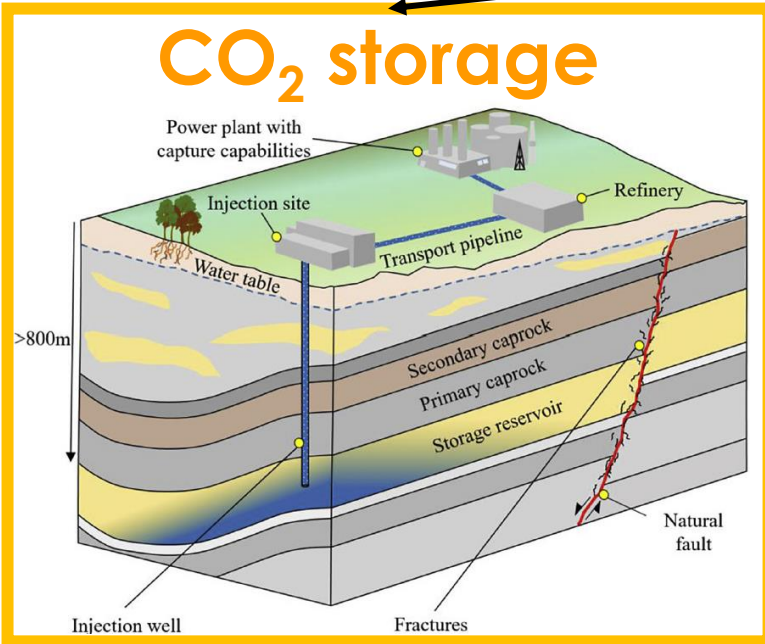
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# Critical Role of Fracture Network Quantification

## Fracture Network Mapping for Energy System Operation/Control

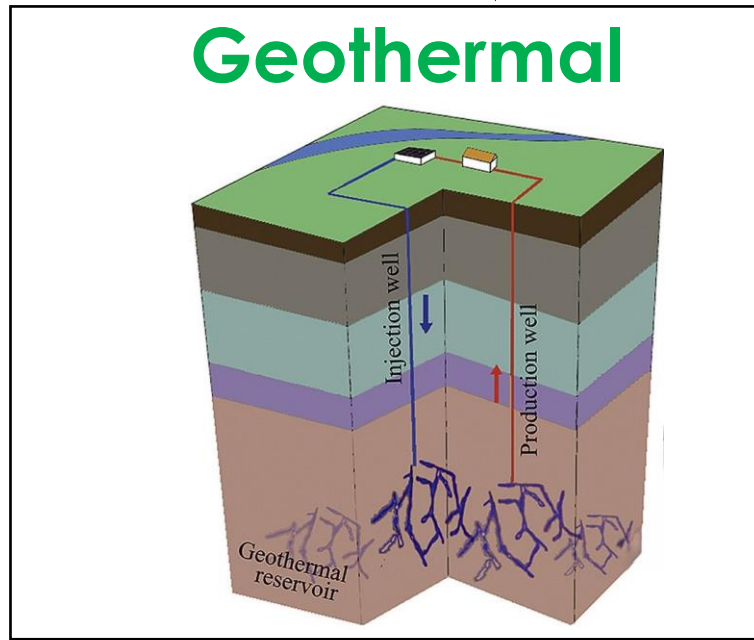
SPE 214996



<https://doi.org/10.1016/j.earscirev.2020.103390>

- Assessing containment of injected CO<sub>2</sub>
- Mitigating fluid migration risk
- Optimizing injection strategy

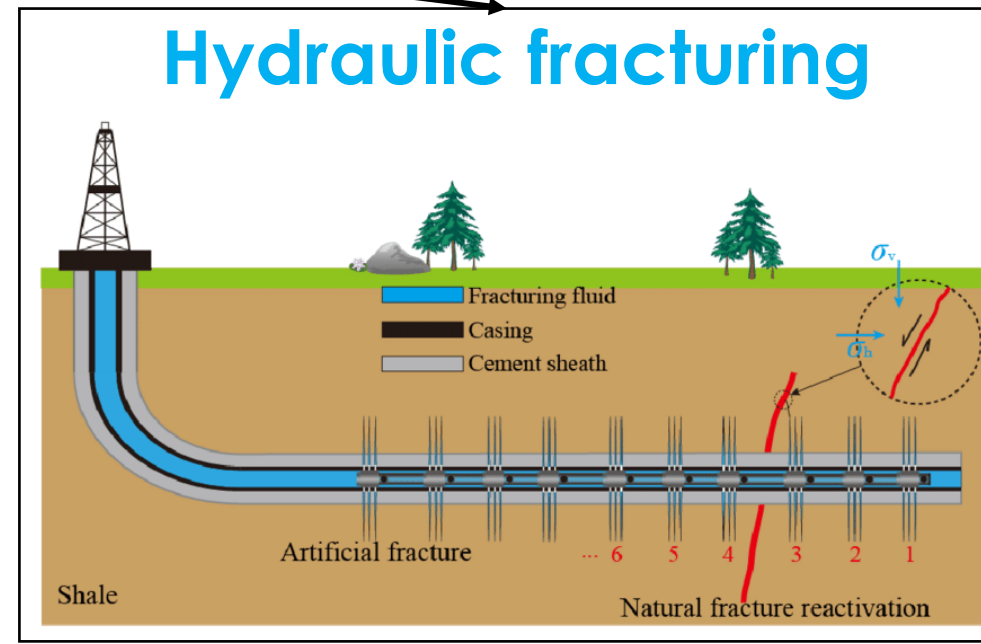
<http://dx.doi.org/10.2139/ssrn.5071255>



<https://doi.org/10.1016/j.renene.2020.06.143>

- Identification of permeable pathways
- Optimize fluid sweeping
- Optimal well placement

URTEC-3723466-MS



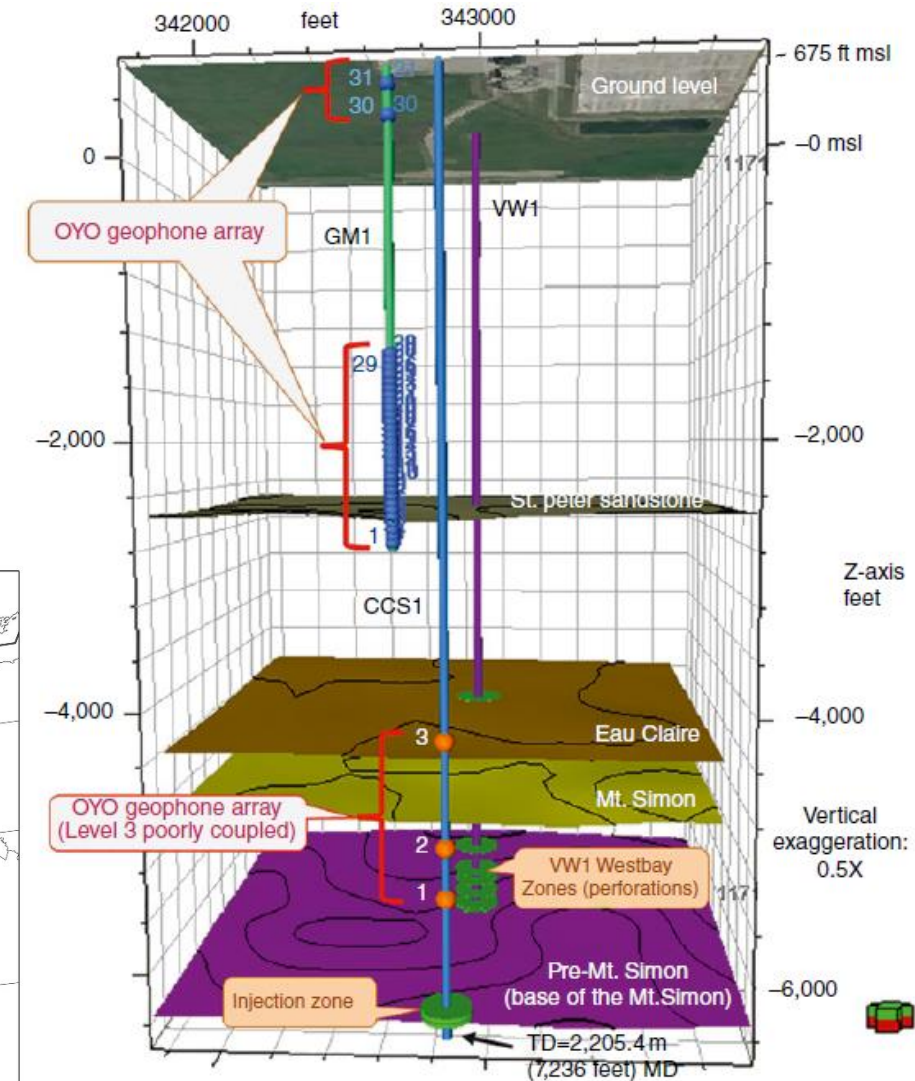
<https://doi.org/10.1088/1755-1315/570/2/022011>

- Optimal designing of treatment strategy
- Maximizing hydrocarbon recovery
- Minimizing environmental contamination

# Road Map

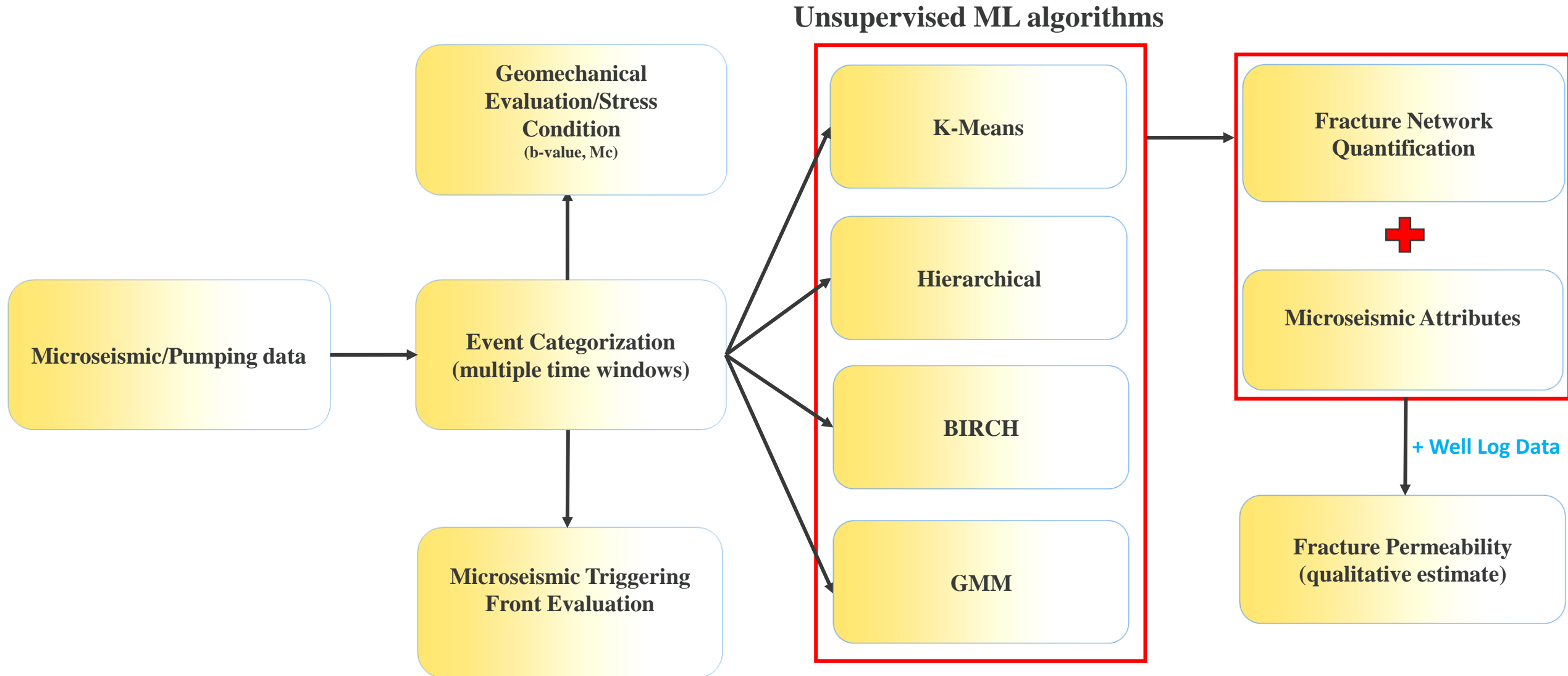
- **Goal**
  - Implementing novel methods to image fractures/faults
- **Site detail**
  - Illinois Basin-Decatur Project (IBDP)
- **Data sets**
  - Microseismic data recorded from downhole array
  - Bottomhole pressure, CO<sub>2</sub> flow rate, well logs
- **Methods**
  - Time-windowing
  - Physics-based ML clustering
  - Fracture network quantification
  - Qualitative permeability estimates

- **Results**



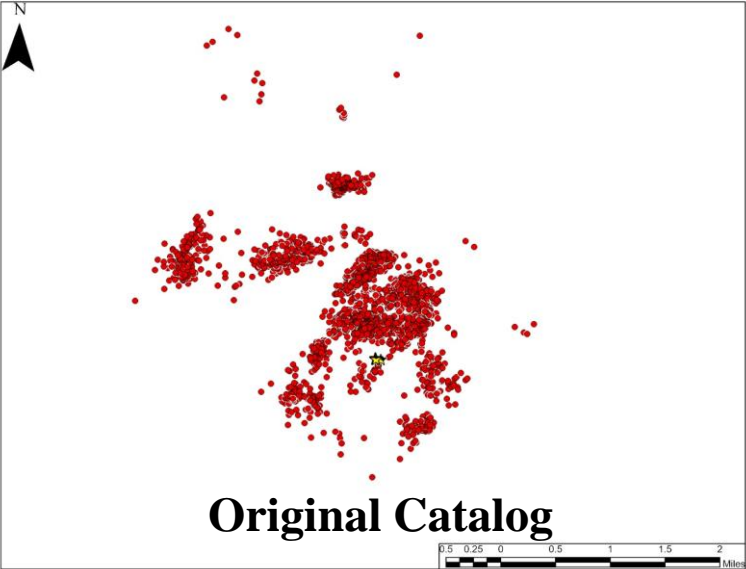
Will et al., 2014

# Structured Approach to Fracture Network Quantification

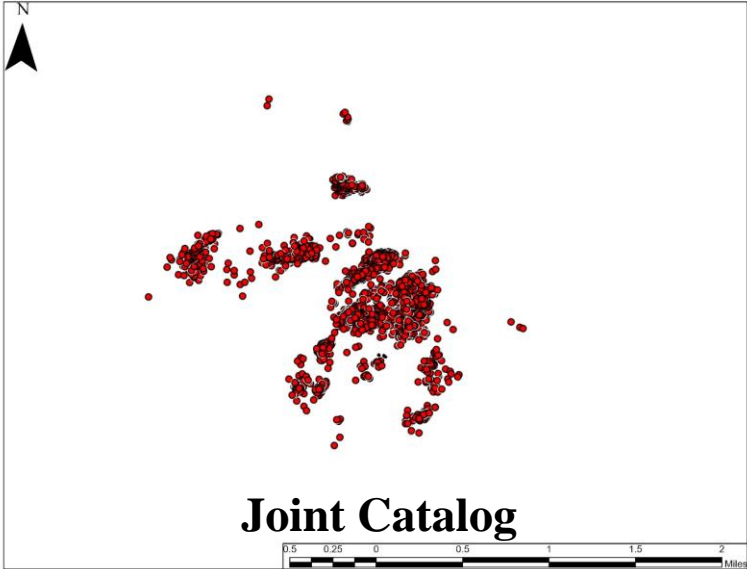


# Data Assimilation

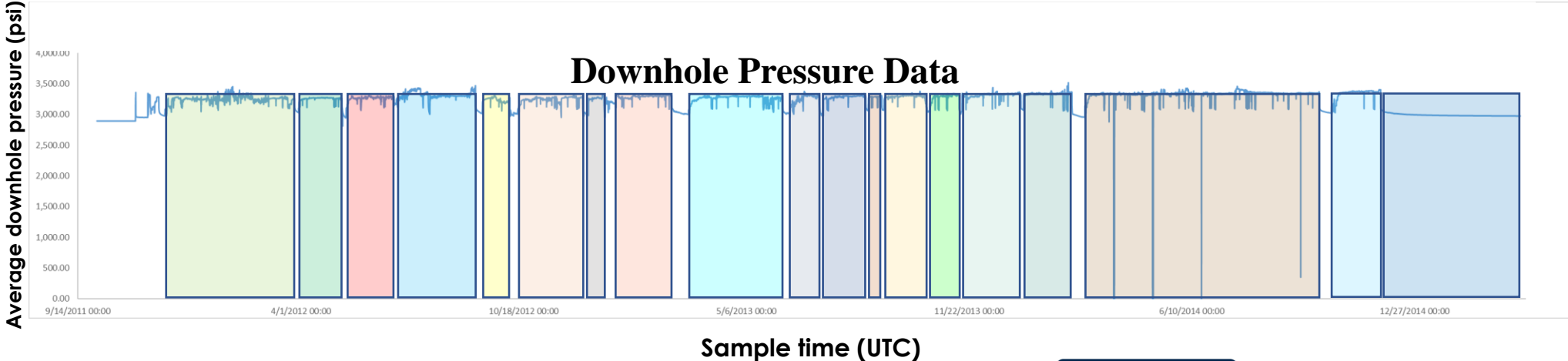
Preliminary Location



Preliminary Location + Double Difference Location



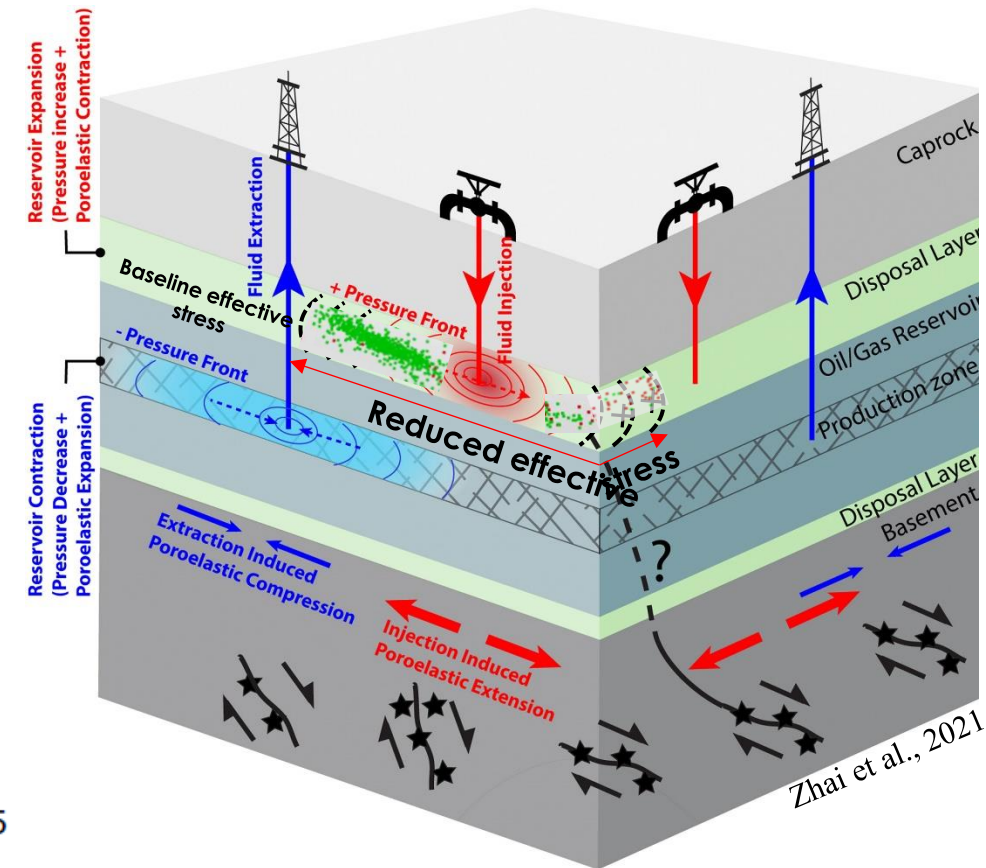
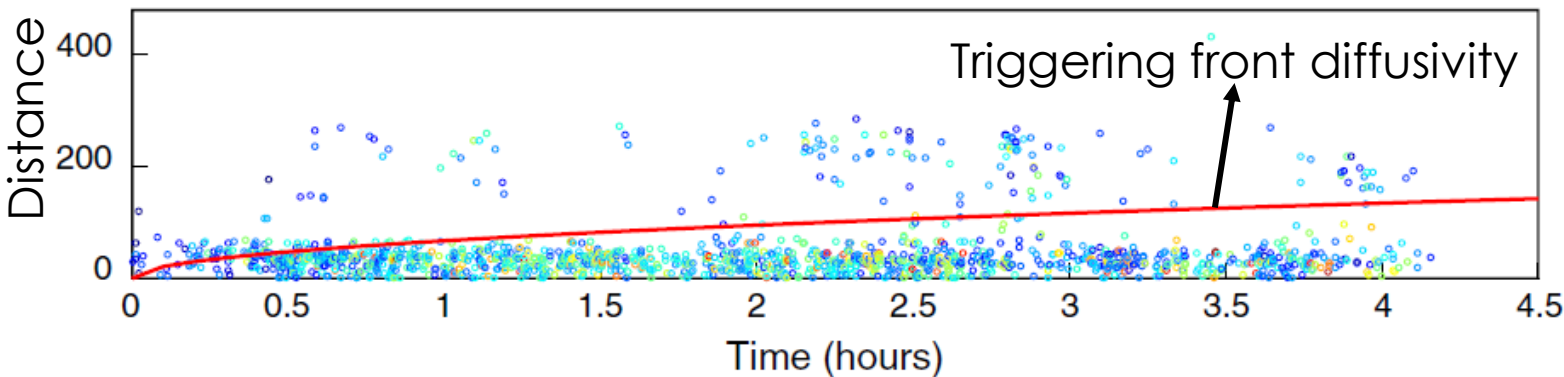
Downhole Pressure Data



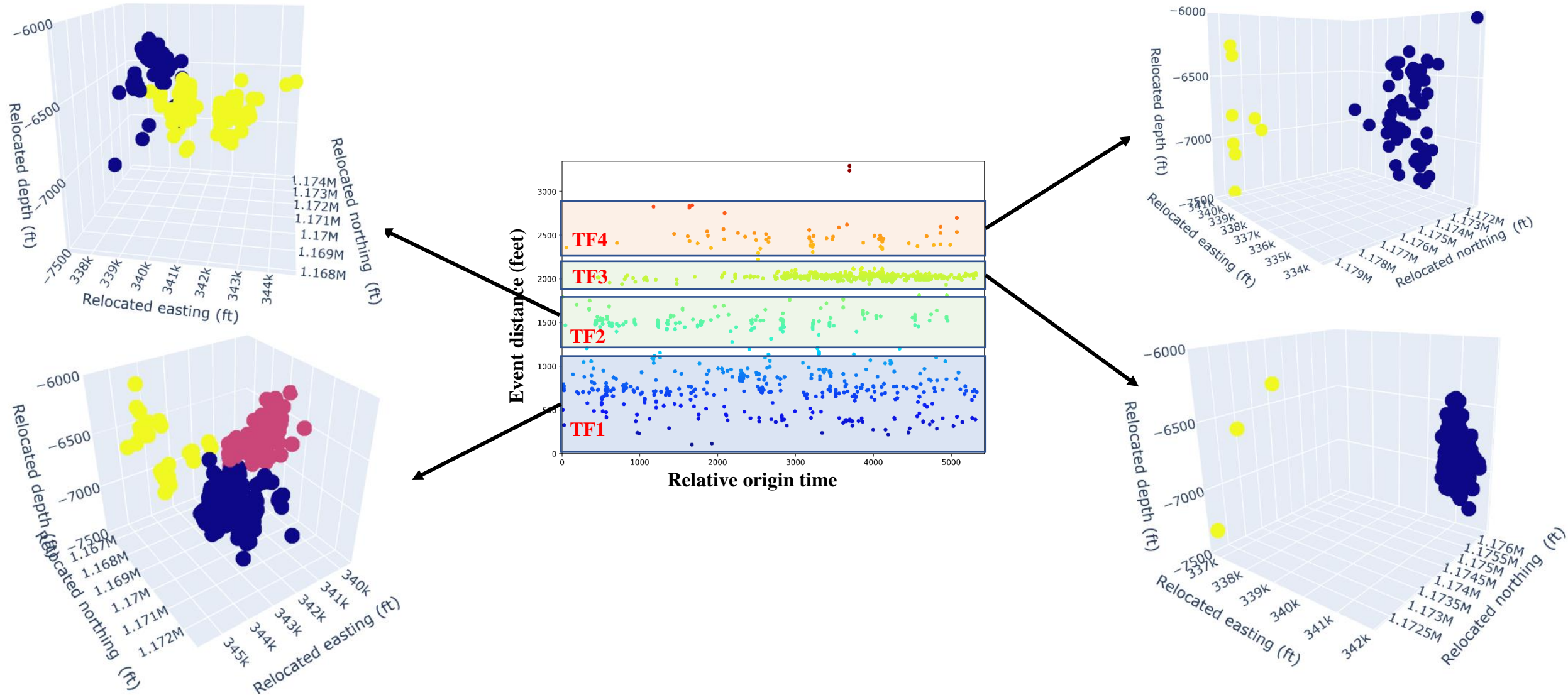
# Hydraulic Diffusivity

- Play a crucial role in understanding and managing high-pressure fluid injection processes
- Measure of how quickly fluids can move through the porous media
- Provides critical information about the flow behavior, pressure distribution, and fluid migration patterns during injection operations
- Derived from mapping the microseismic triggering front and can be directly linked to rock permeability

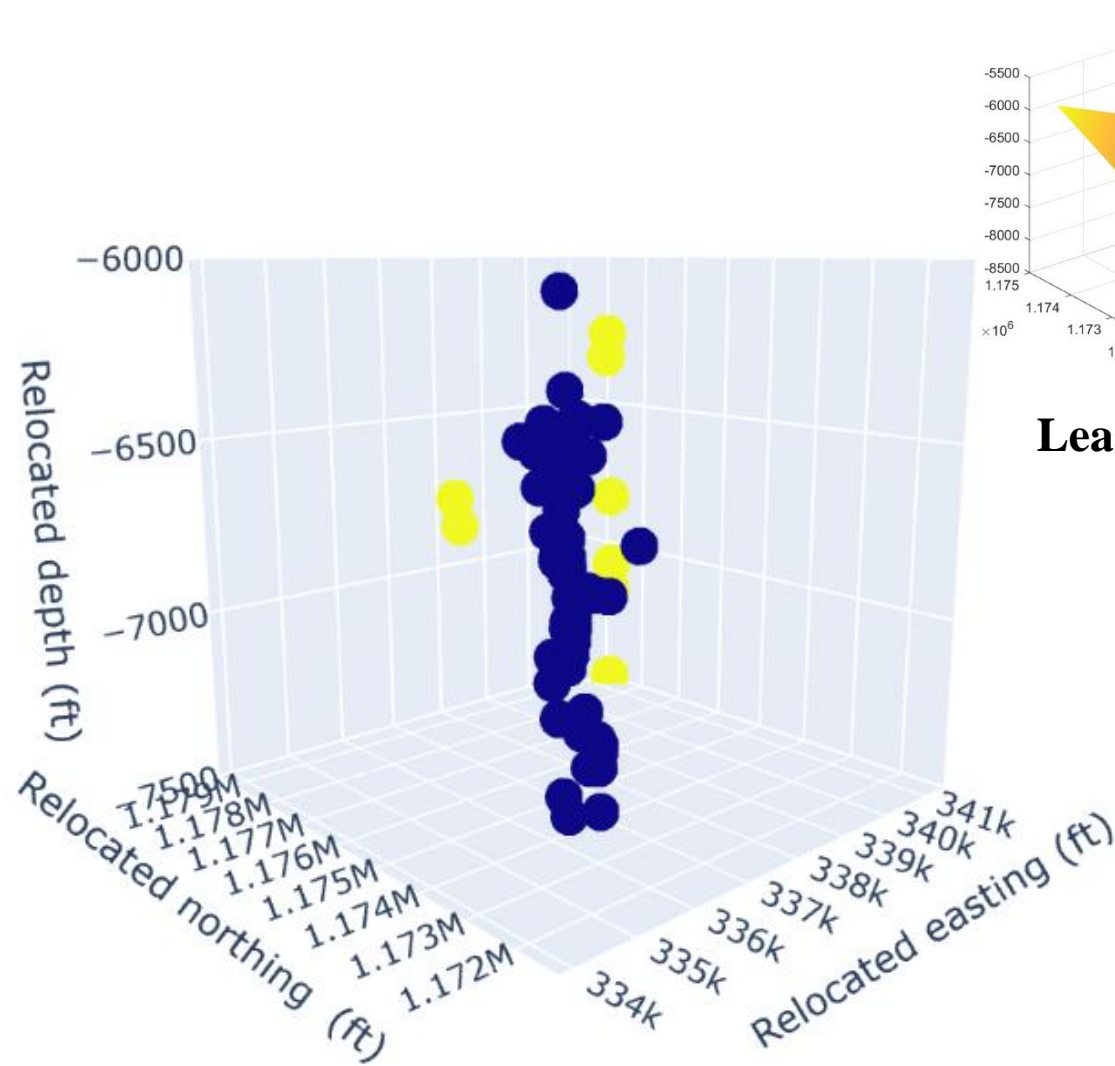
$$r_t(t) = \sqrt{4\pi D_{tf} t}$$



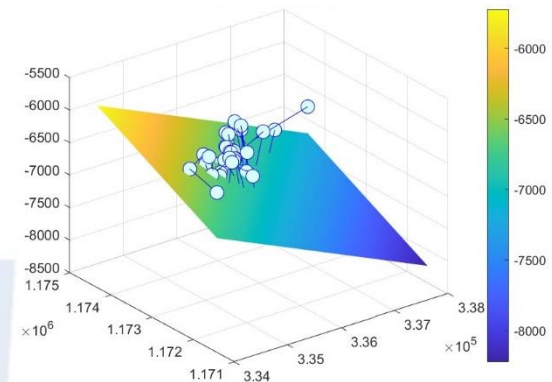
# Event Clustering Using Unsupervised ML algorithms



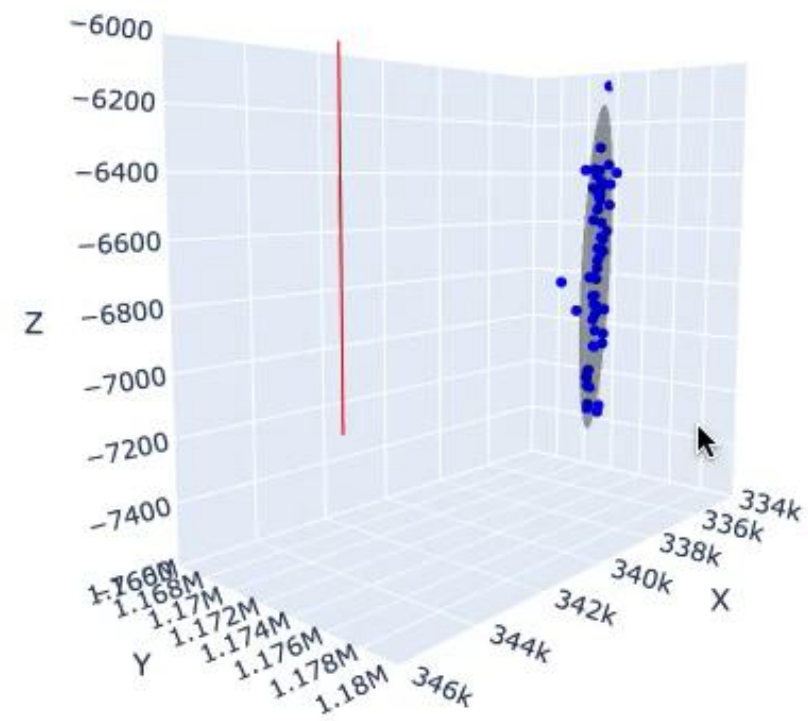
# Fracture Plane Quantification Using Standard Deviation Ellipsoid



Microseismic Cluster

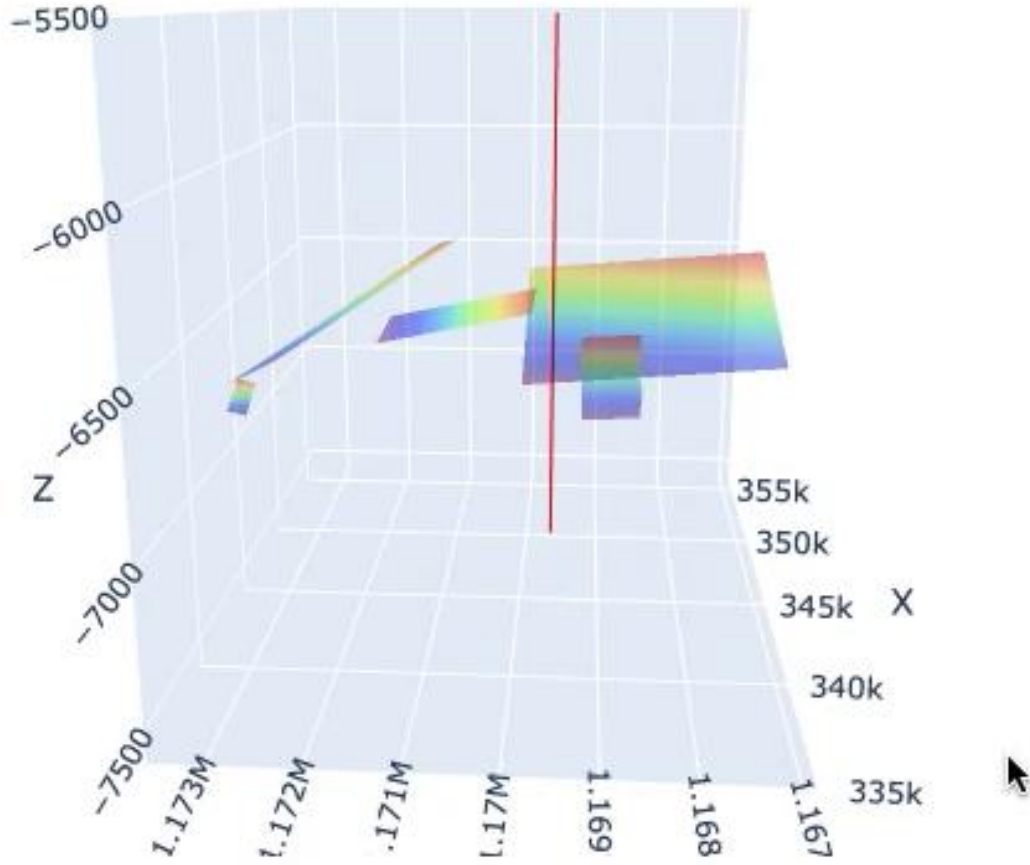


Least square plane

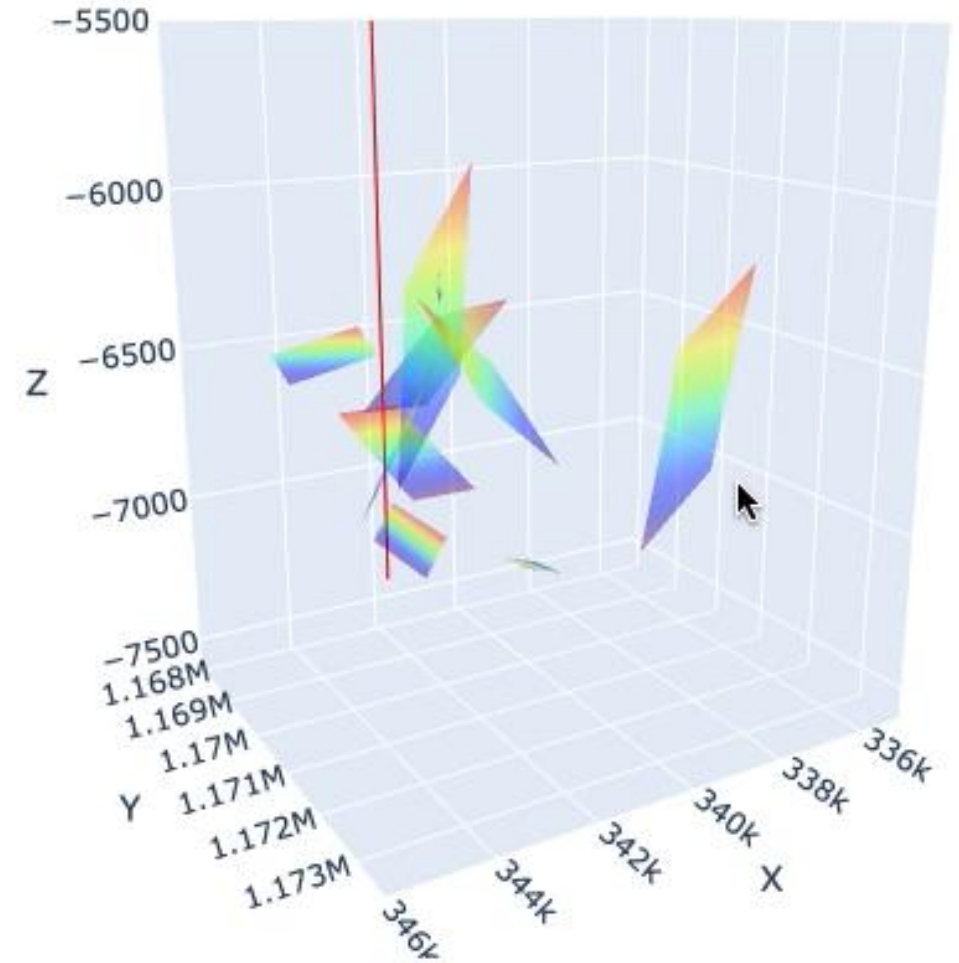


2-Standard Deviational Ellipsoid

# 3D Fracture Plane Distribution

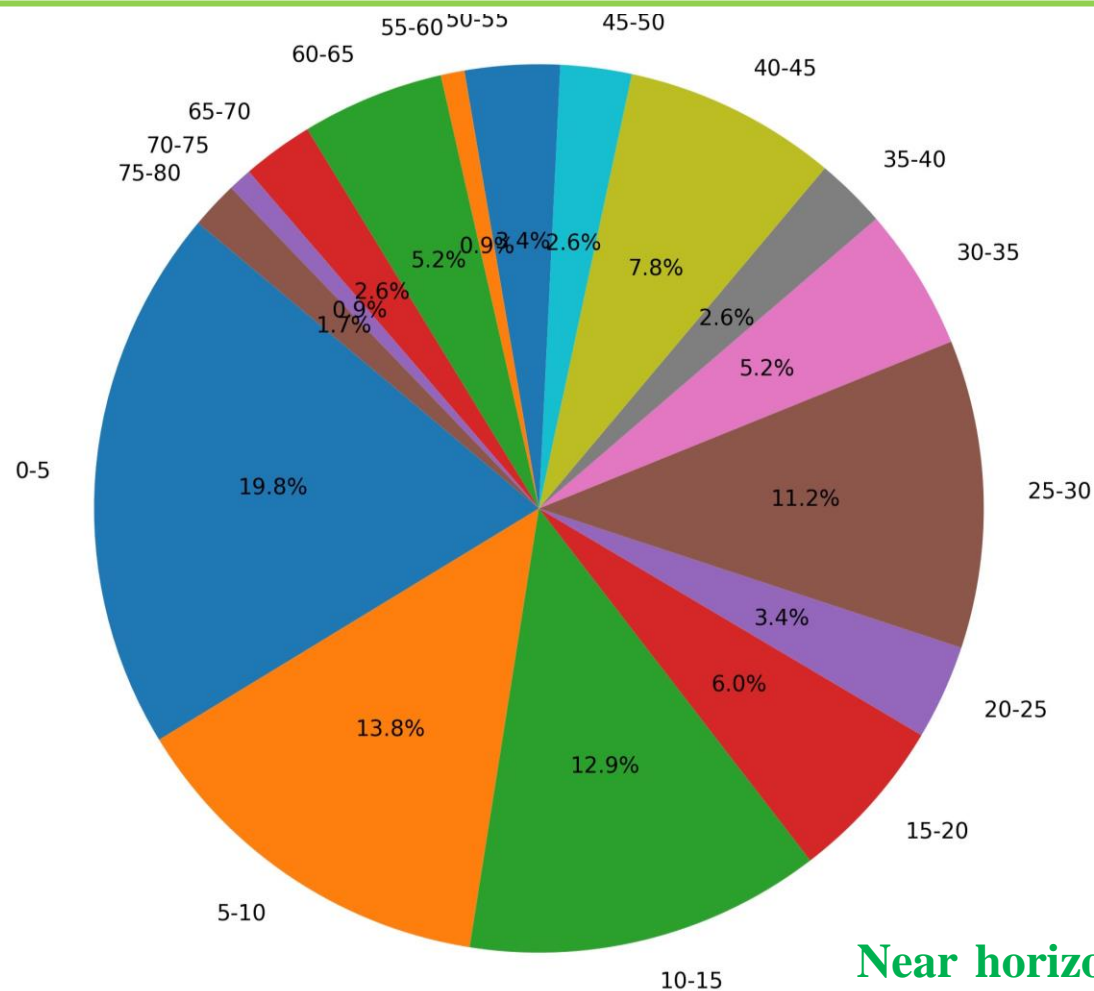


Window 3



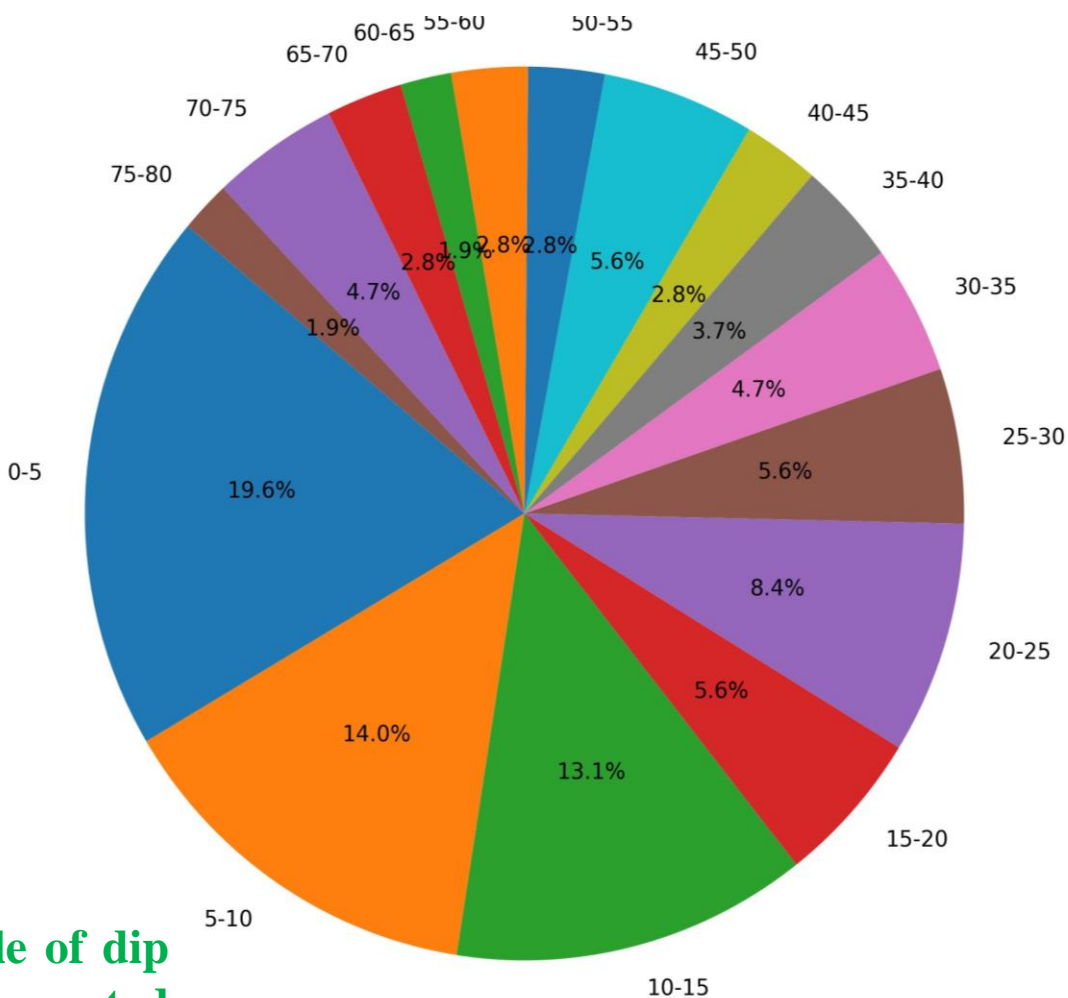
Window 9

# 3D Fracture Attributes (variation in dip)



Hierarchical

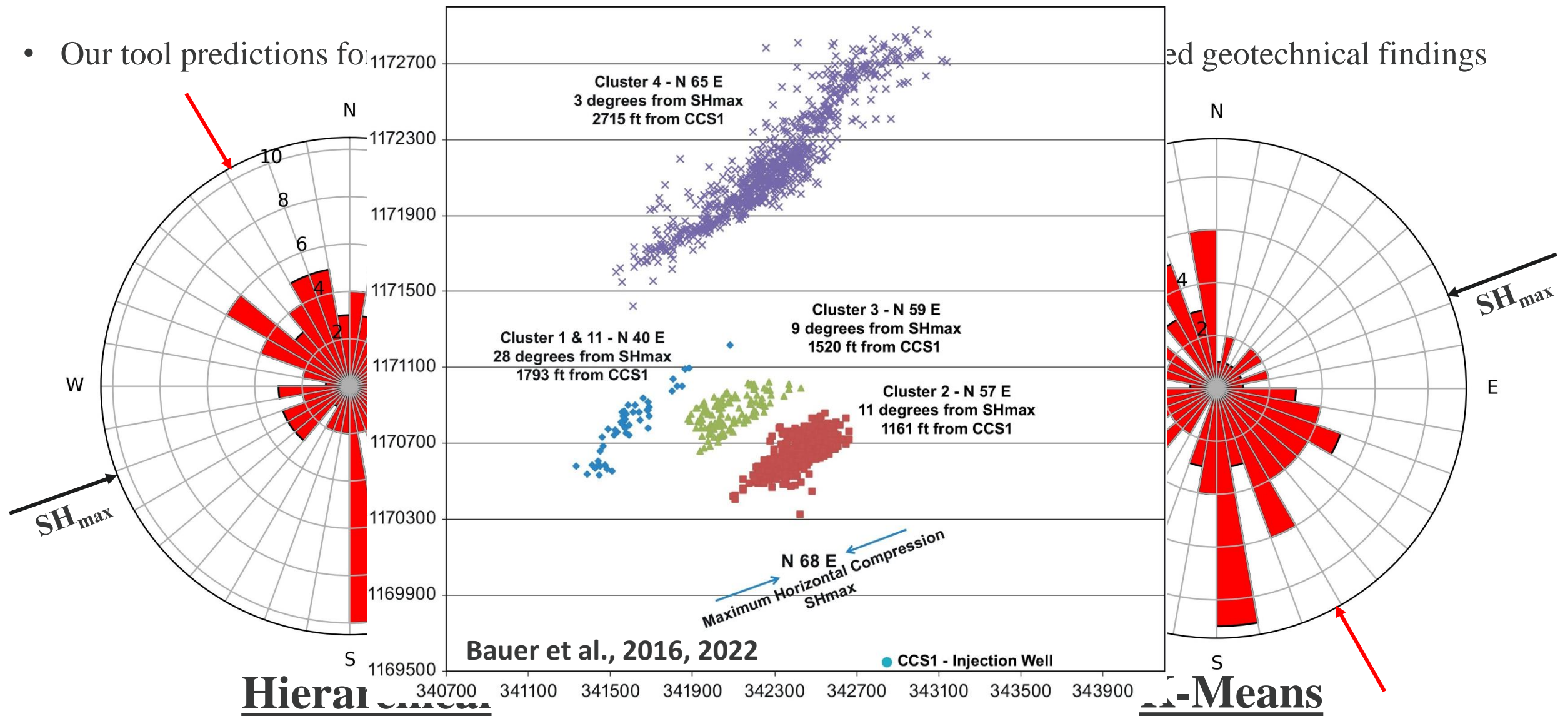
Near horizontal/small angle of dip agrees with other studies reported by using different dataset (Bauer et al., 2016, 2022)



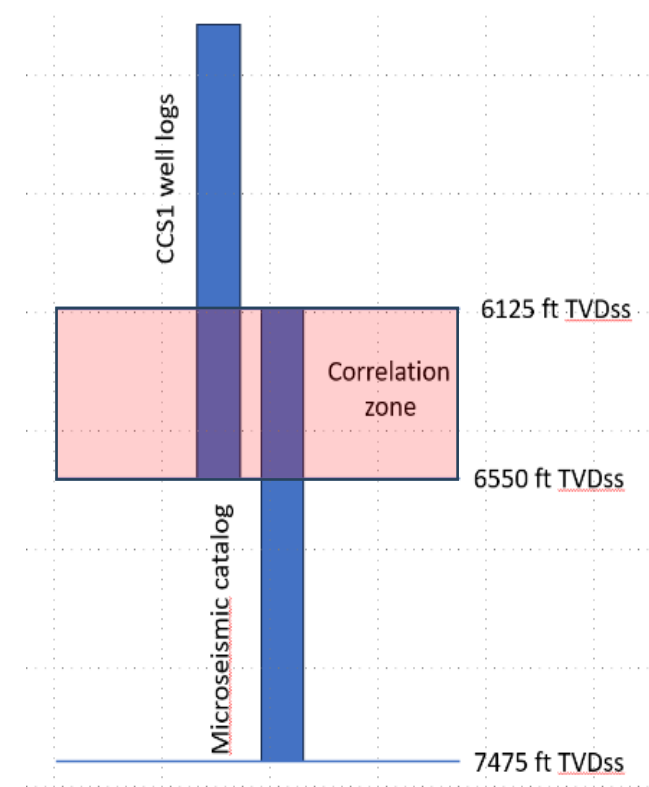
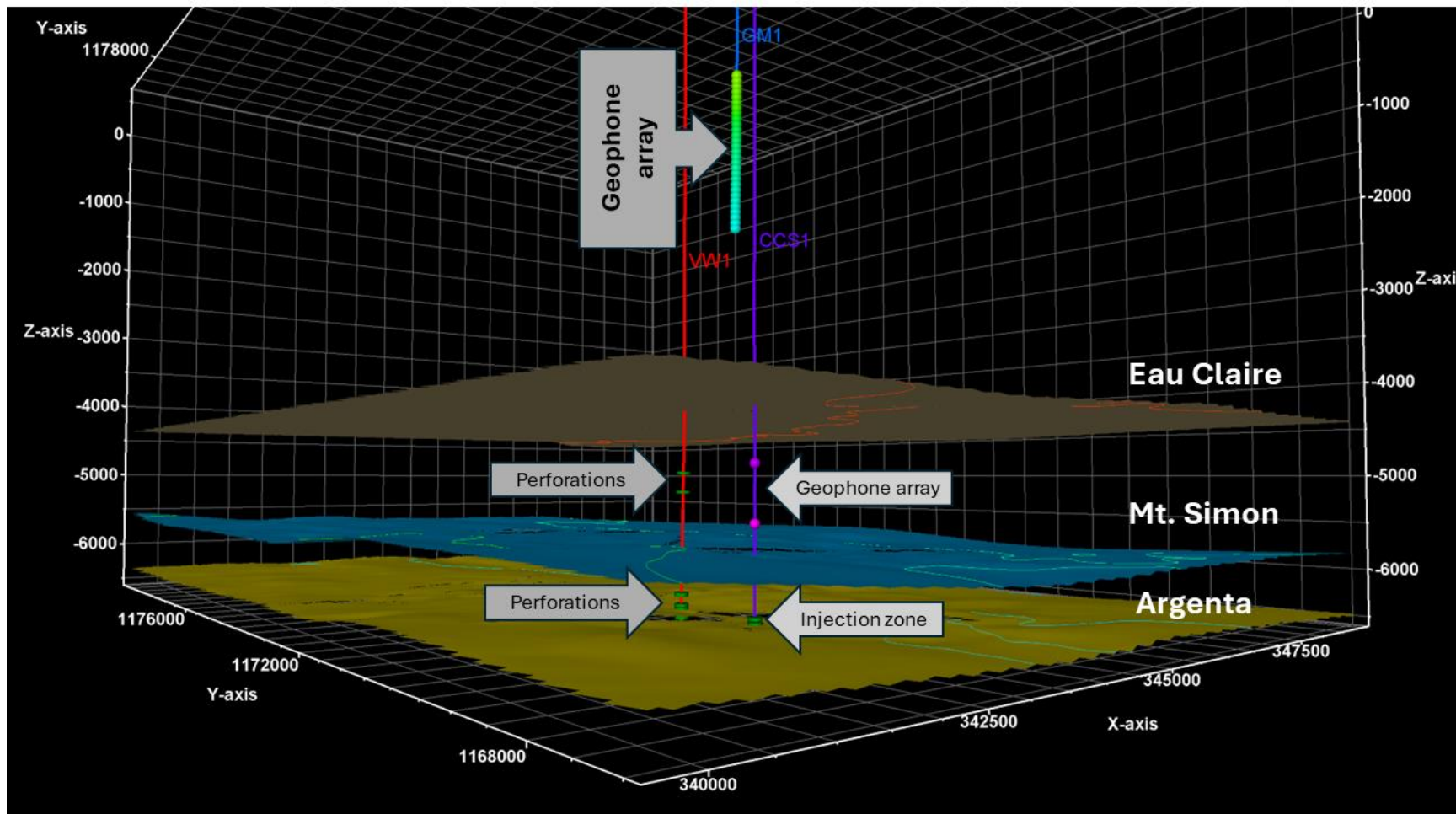
K-Means

# 3D Fracture Attributes (dip direction)

- Our tool predictions for

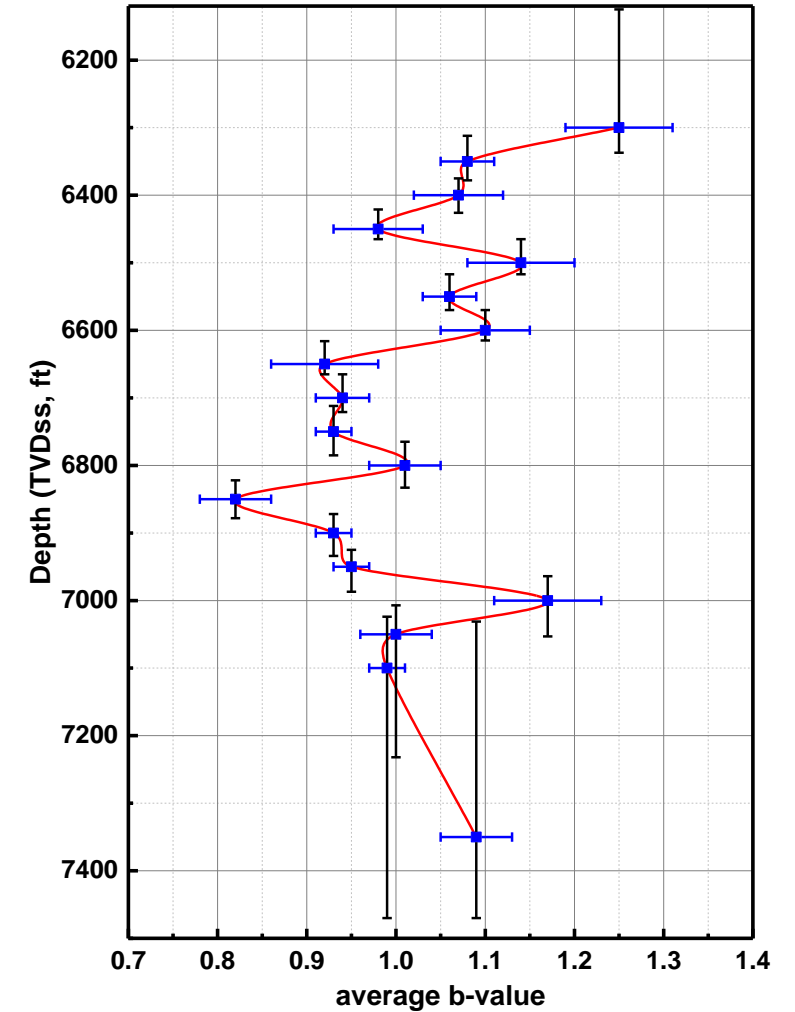
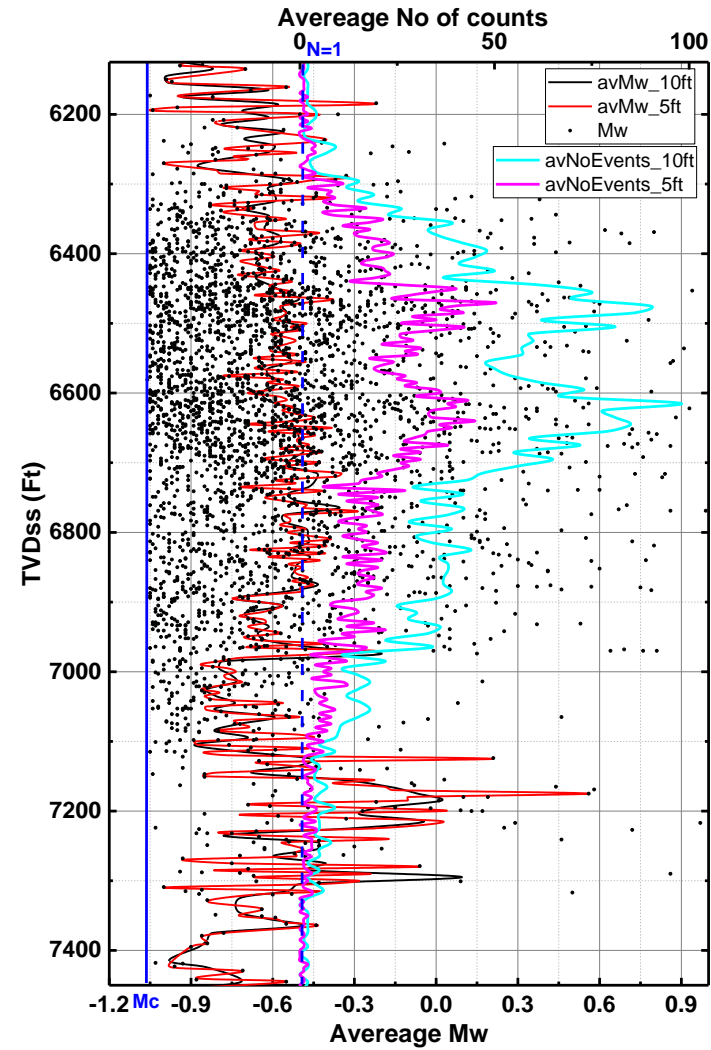
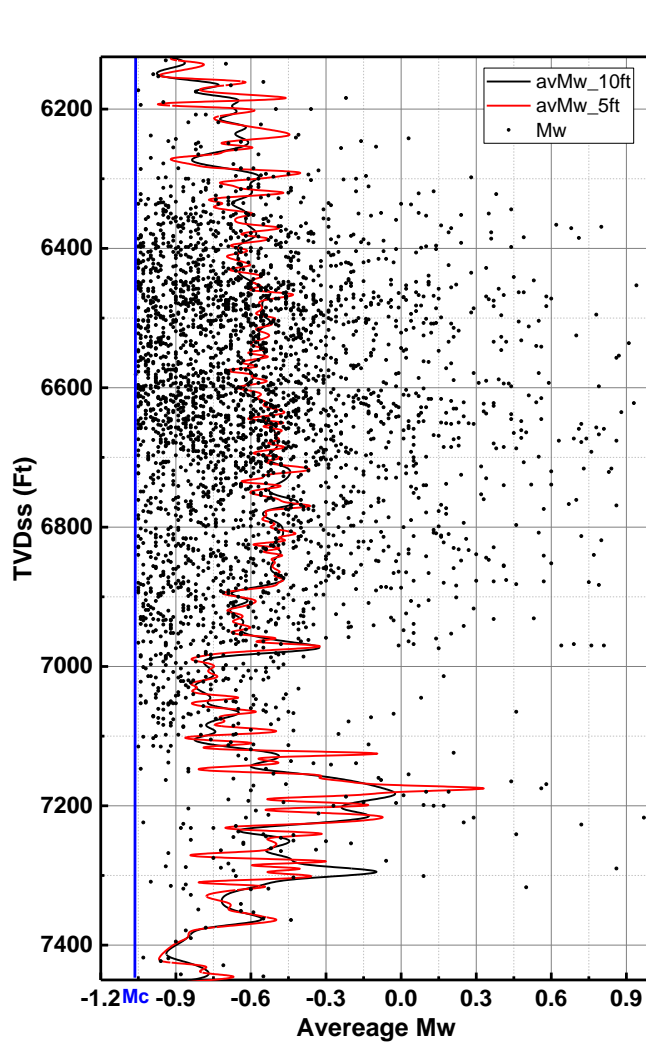


# Geomechanical correlation with microseismicity



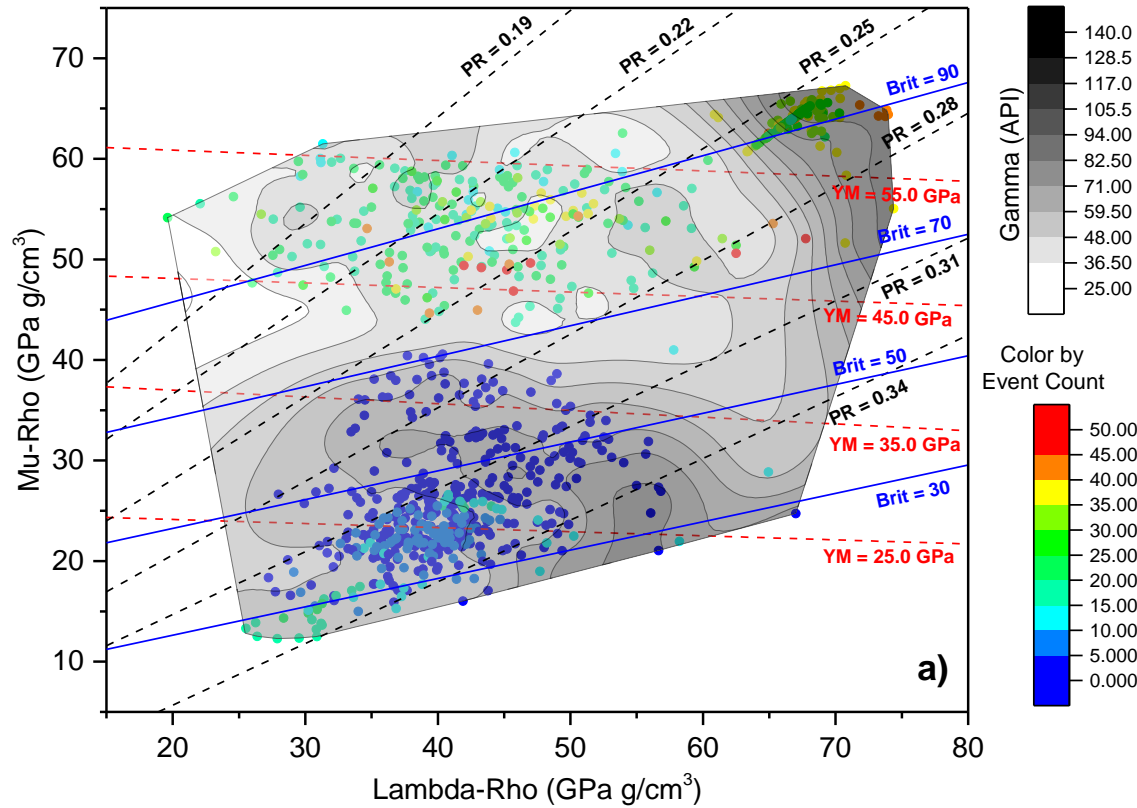
$\lambda\rho$  = Density scaled compression  
 $\mu\rho$  = Stiffness

# Microseismic Pseudologs (CCS1)

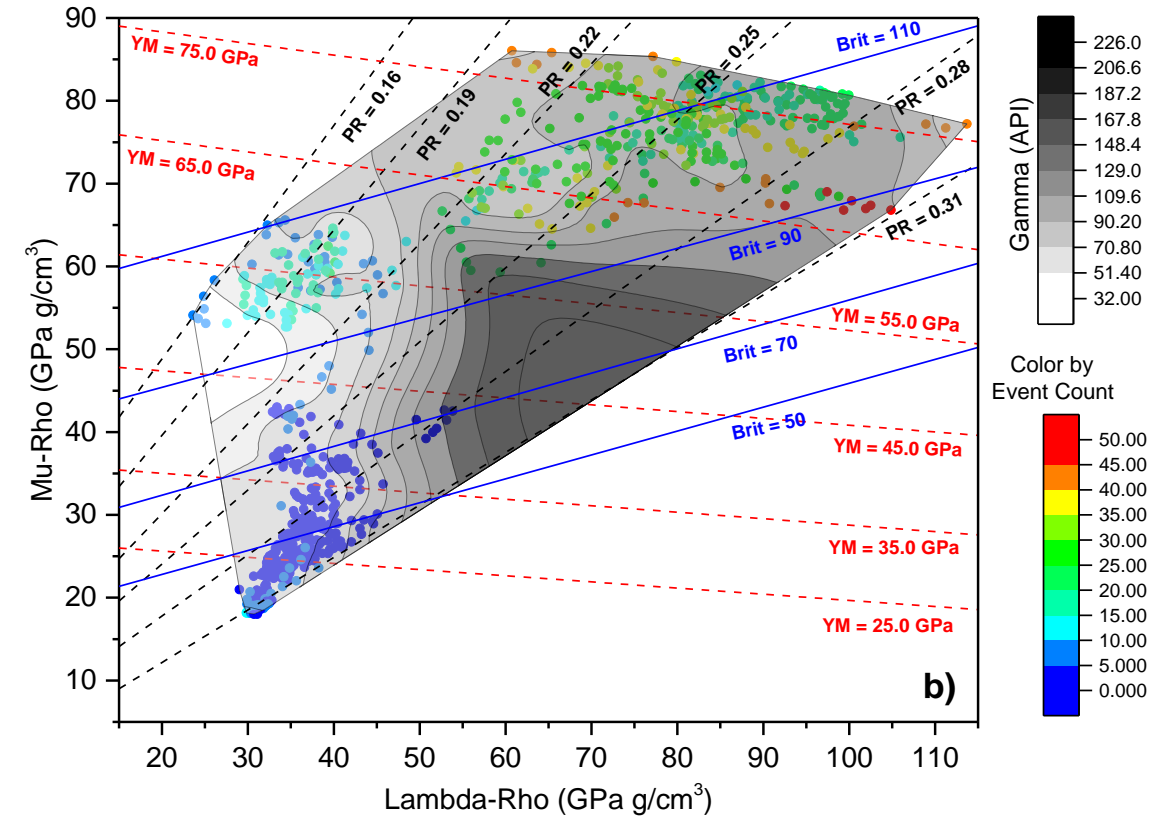


# Geomechanical correlation with microseismicity

- $\uparrow$  PR  $\downarrow$  YM:  $\downarrow$  Event count
- $\downarrow$  PR:  $\uparrow$  Event count
- $\uparrow$  PR  $\downarrow$  YM:  $\uparrow$  Resistance to fracture  $\uparrow$  Amenable to deformation



CCS1



VW1

# Take Away Points

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- Developed a machine-learning-based solution for fracture network quantification using recorded microseismic events.
- Successfully applied the tool to the Illinois Basin – Decatur Project (IBDP) dataset to characterize reservoir-scale subsurface fracture network.
- Identified dominant fracture planes associated with CO<sub>2</sub> injection-induced microseismic activity that are in complete unison with the orientation of preexisting stress condition.
- Estimated qualitative permeability changes along fracture planes based on event magnitudes.
- Our technique provides a data-driven alternative to conventional Discrete Fracture Network (DFN) modeling approaches.
- The technique is highly scalable and transferrable beyond CO<sub>2</sub> storage, including geothermal energy and hydraulic fracturing projects.

# Questions??

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## Fracture Network Mapping for System Operation/Control

