



Lessons learned from a decade of disposal-induced Oklahoma seismicity for future regional approaches to gigaton-scale carbon storage

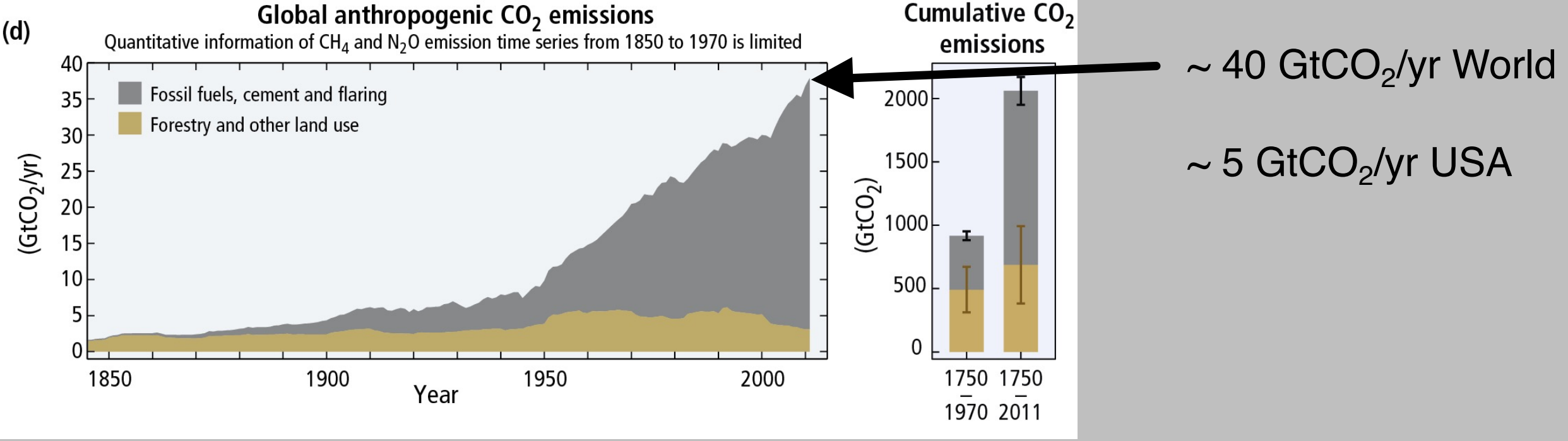
Jake Walter

Oklahoma Geological Survey

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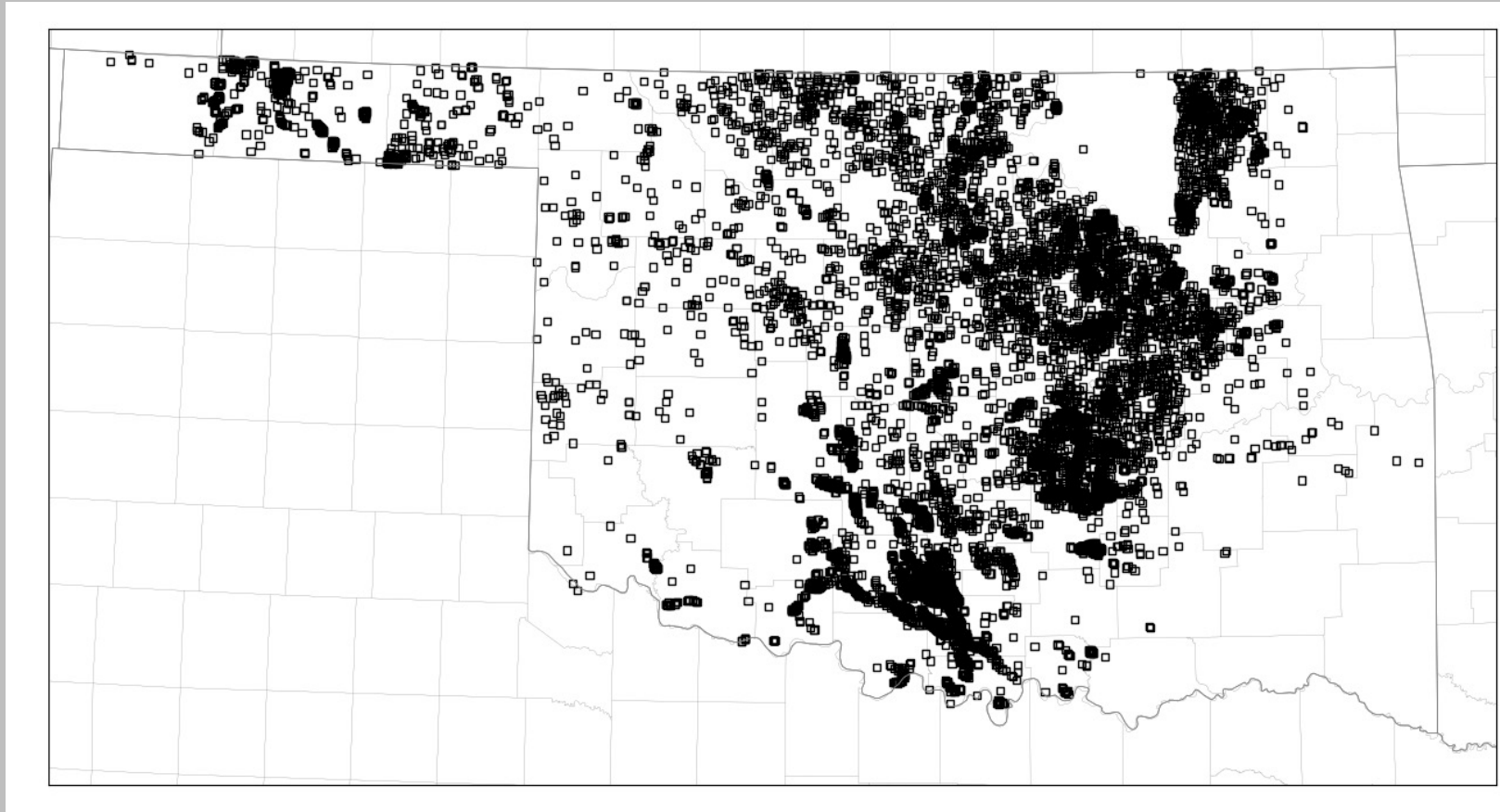
Emissions



2015 National Academies Climate Intervention report – “*Recommendation 2: The committee recommends research and development investment to **improve methods of carbon dioxide removal and disposal at scales that would have a global impact on reducing greenhouse warming**, in particular to minimize energy and materials consumption, identify and quantify risks, lower costs, and develop reliable sequestration and monitoring*”

Decatur, Illinois – 1 Mt over 3 years at a cost of \$200 million

~14,000 Class II wells within the Oklahoma Corporation Commission Underground Injection Control program

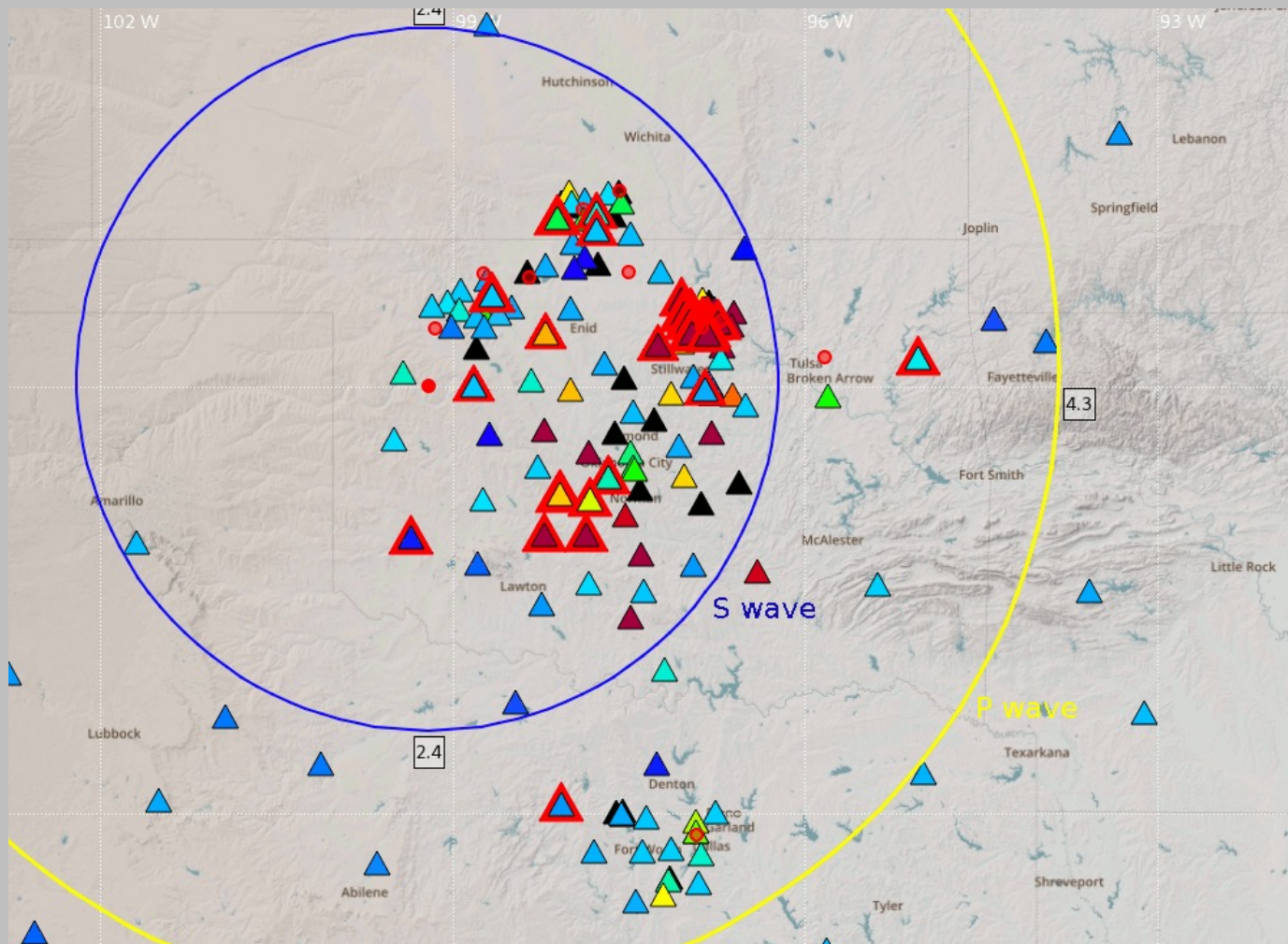


Long-term carbon storage needs to be broadly distributed with a regional approach to risk

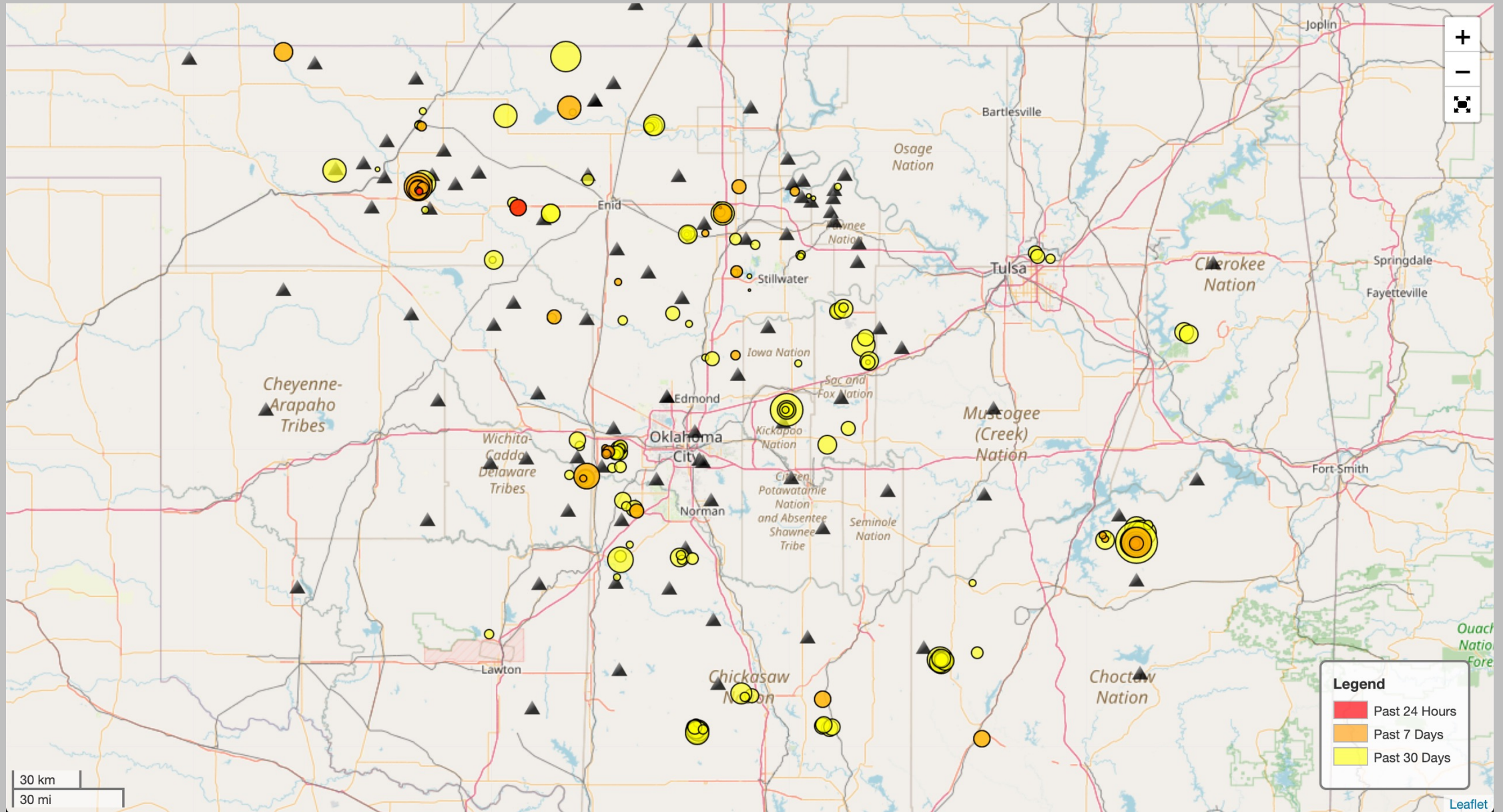
Leverage new technologies in hardware and software



Jake Walter, Ph.D. – State Seismologist
Paul Ogwari, Ph.D. – Geophysicist
Fernando Ferrer – Lead Analyst/Metadata
Andrew Thiel – Analyst/Outreach/Field
Isaac Woelfel – Field Technician



ogs.ou.edu for products, rtserve.ou.edu for real-time seedlink buffer



~15-20 earthquakes/day

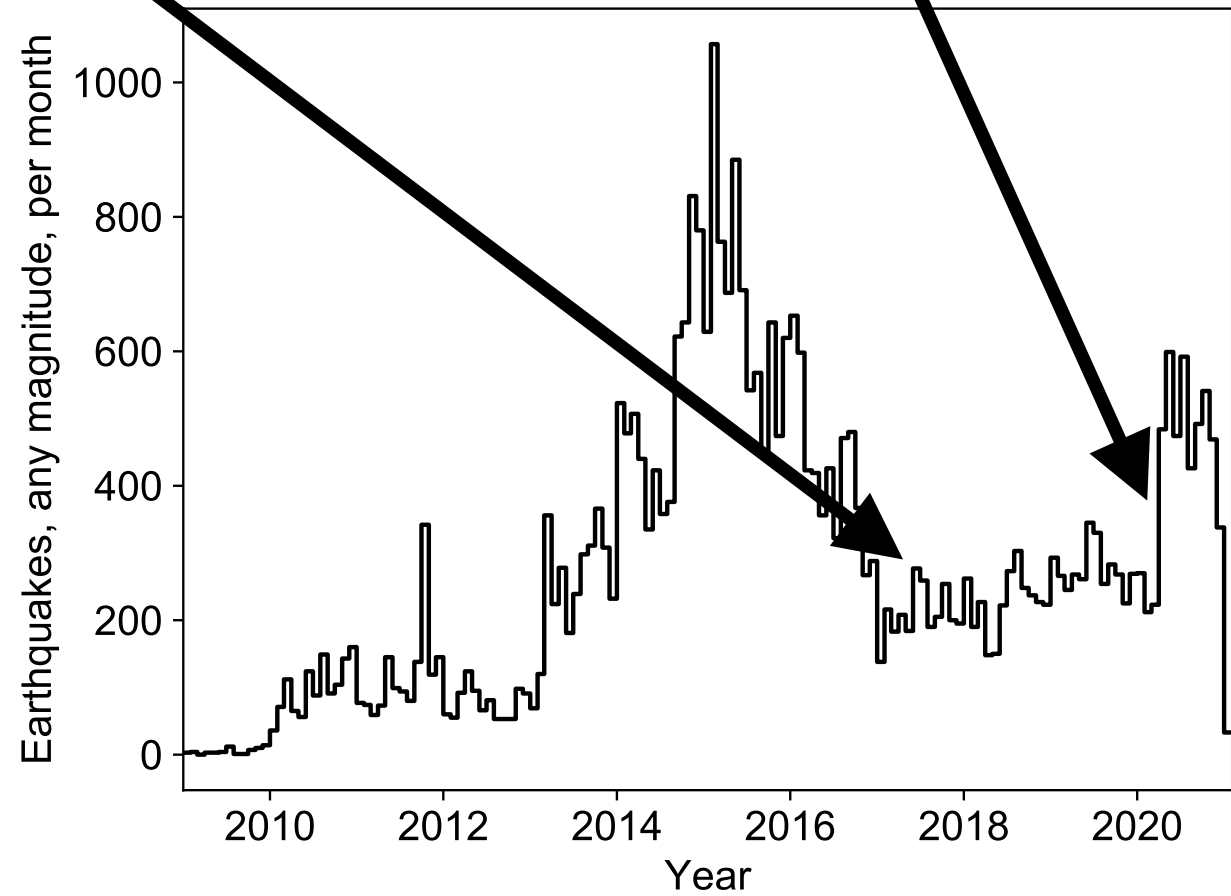
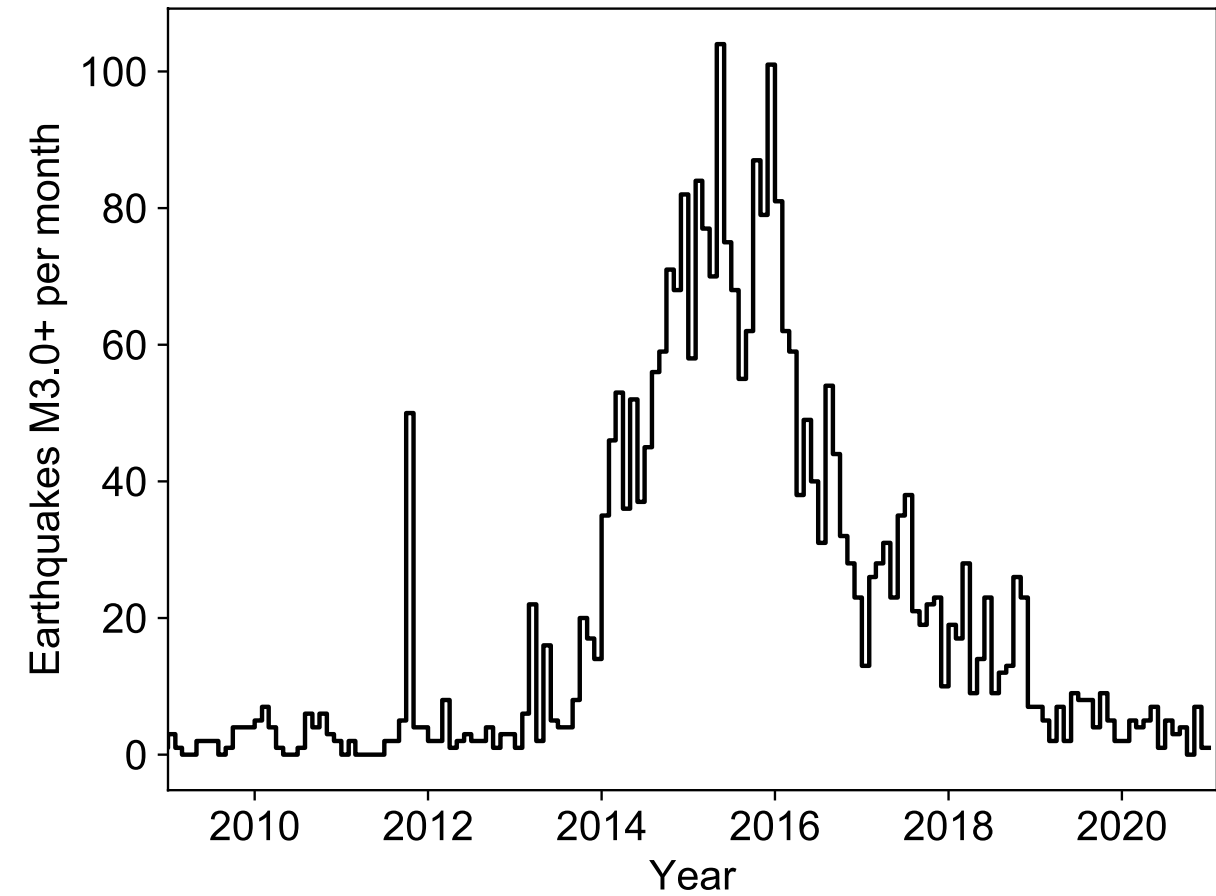
As of May 29, 2019 - OGS is the authoritative regional network in the state, so USGS published are reported by OGS

The screenshot shows a web browser window with the URL <https://earthquake.usgs.gov/earthquakes/eventpage/ok2019klmy/origin/detail>. The page header includes the USGS logo (science for a changing world) and the Oklahoma Geological Survey logo. A green seismic waveform is displayed in the background. Below the header, the text "Earthquake Hazards Program" is visible. The main content area features a navigation menu on the left with options: "Latest Earthquakes", "Overview", "Interactive Map", "Regional Information", "Felt Report - Tell Us!", "Technical", "Origin" (selected), "Waveforms", "Download Event KML", and "View Nearby Seismicity". The main title is "M 1.8 - 21km SSE of Tonkawa, Oklahoma", with a subtitle "2019-05-29 14:23:06 (UTC) | 36.504°N 97.218°W | 5.7 km depth". Under the "Origin" section, there is a link "View all origin products (1 total)". A note states "Contributed by OK¹ last updated 2019-05-29 15:01:56 (UTC)" with two green checkmarks: "The data below are the most preferred data available" and "The data below have been reviewed by a scientist". A table with three columns: "Details", "Phases", and "Magnitudes" is shown. The table contains three rows of data: Magnitude uncertainty (1.8 ml ± 0.2), Location (36.504°N 97.218°W), and Depth uncertainty (5.7 km ± 0.5).

Details	Phases	Magnitudes
Magnitude uncertainty		1.8 ml ± 0.2
Location		36.504°N 97.218°W
Depth uncertainty		5.7 km ± 0.5

Improved monitoring software

easyQuake



Summary – full turnkey earthquake catalog tool, including FDSN waveform download and QuakeML event file creation

1. Detect – Choose machine-learning picker, either the generalized phase detector (Ross et al., 2018) or EQTransformer (Mousavi et al., 2020)

2. Associate and locate - Modified PhasePapy 1D associator (Chen and Holland, 2016)

3. Magnitude - Compute preliminary magnitude

4. Full QuakeML file event files

5. Input it into SeiscomP system for analyst review or output various file formats for relocation or focal mechanism determination

easyQuake python package

WORK FLOW

1. Download data

2. Run machine-learning phase detection

3. Associate phase picks for event detection

4. Combine all associated events in project folder and locate with hypoinverse

5. Compute local magnitudes and form a fully-populated QuakeML file, with P-wave first motion polarity

(Optional) Output hypoDD file

(Optional) Output hash input files for focal mechanism

Continuous mode

download_mseed

detection_continuous

association_continuous

combine_associated

magnitude_quakeml

quakeml_to_hypodd

quakeml_hashpy

Event mode

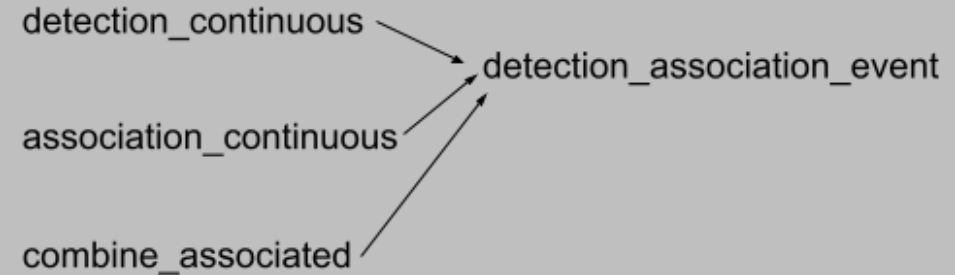
download_mseed_event

detection_association_event

magnitude_quakeml

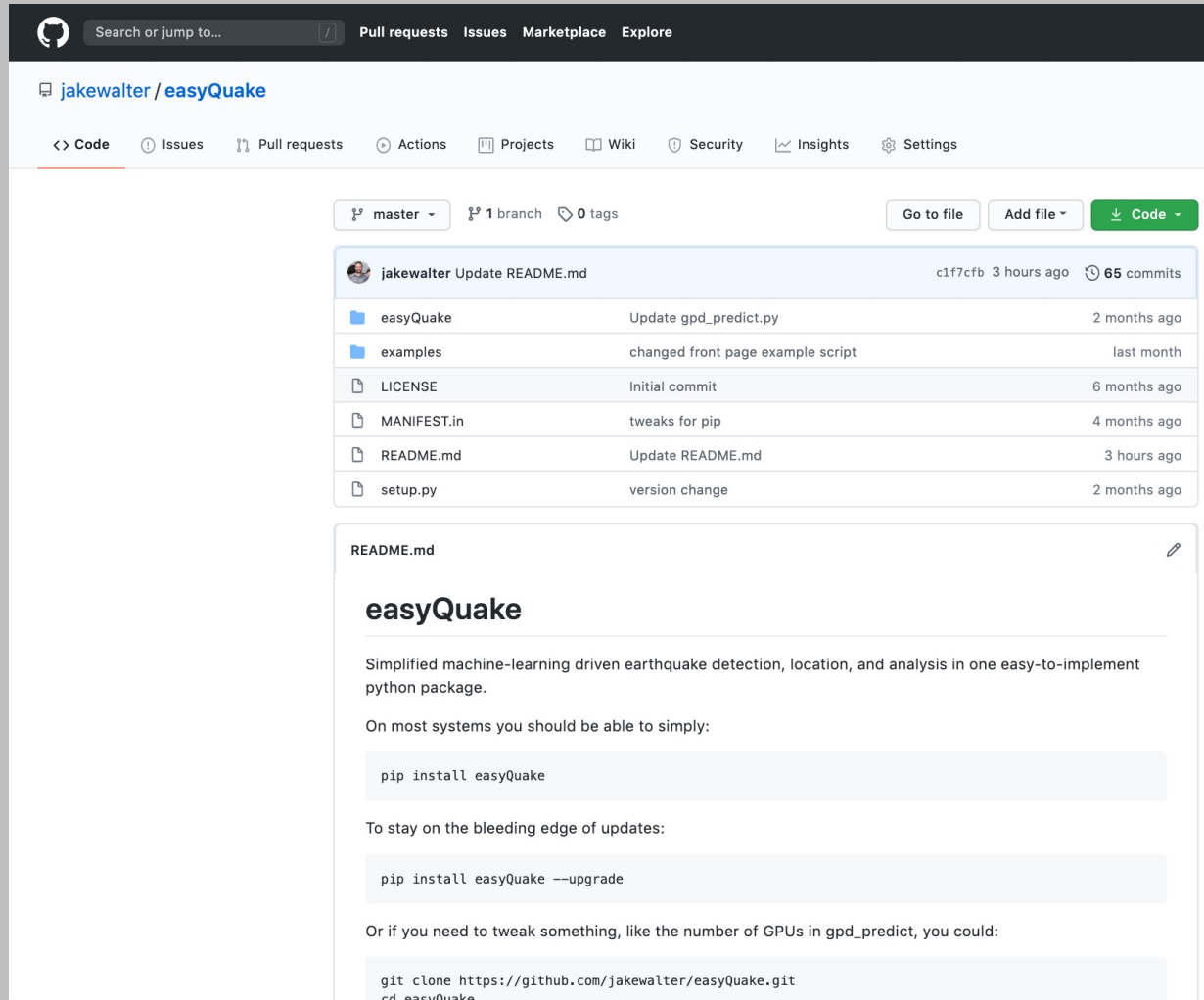
quakeml_to_hypodd

quakeml_hashpy



Can be run on data collected already or direct it to download data from FDSN servers

<https://github.com/jakewalter/easyQuake>



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master 1 branch 0 tags Go to file Add file Code

File	Commit Message	Time
easyQuake	Update gpd_predict.py	2 months ago
examples	changed front page example script	last month
LICENSE	Initial commit	6 months ago
MANIFEST.in	tweaks for pip	4 months ago
README.md	Update README.md	3 hours ago
setup.py	version change	2 months ago

README.md

easyQuake

Simplified machine-learning driven earthquake detection, location, and analysis in one easy-to-implement python package.

On most systems you should be able to simply:

```
pip install easyQuake
```

To stay on the bleeding edge of updates:

```
pip install easyQuake --upgrade
```

Or if you need to tweak something, like the number of GPUs in gpd_predict, you could:

```
git clone https://github.com/jakewalter/easyQuake.git
cd easyQuake
```

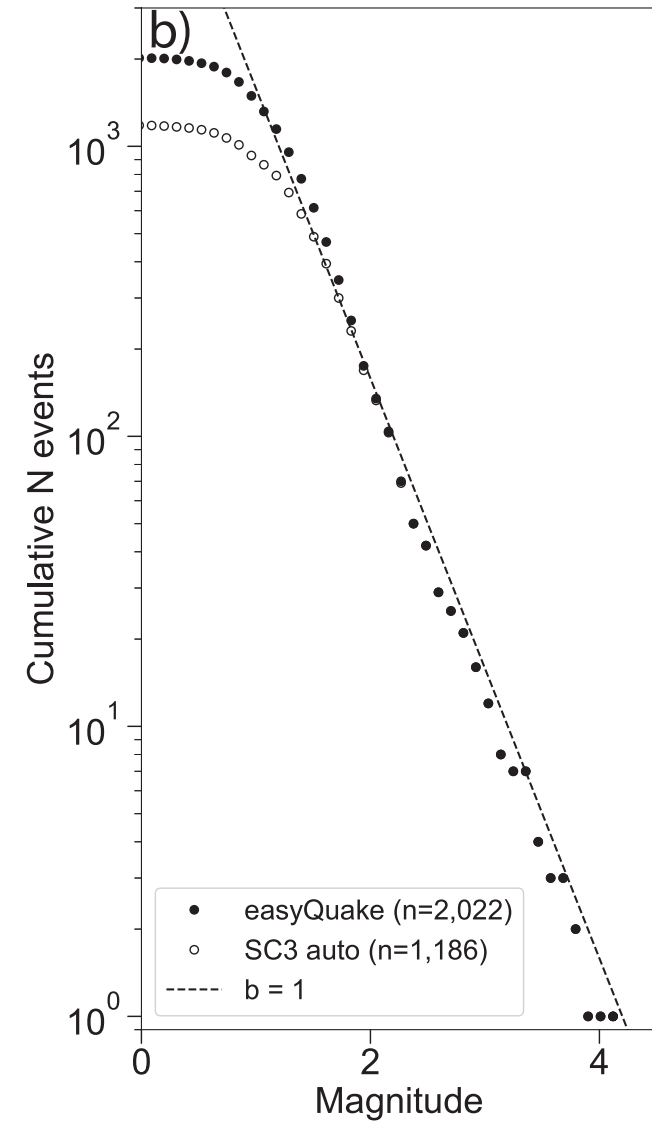
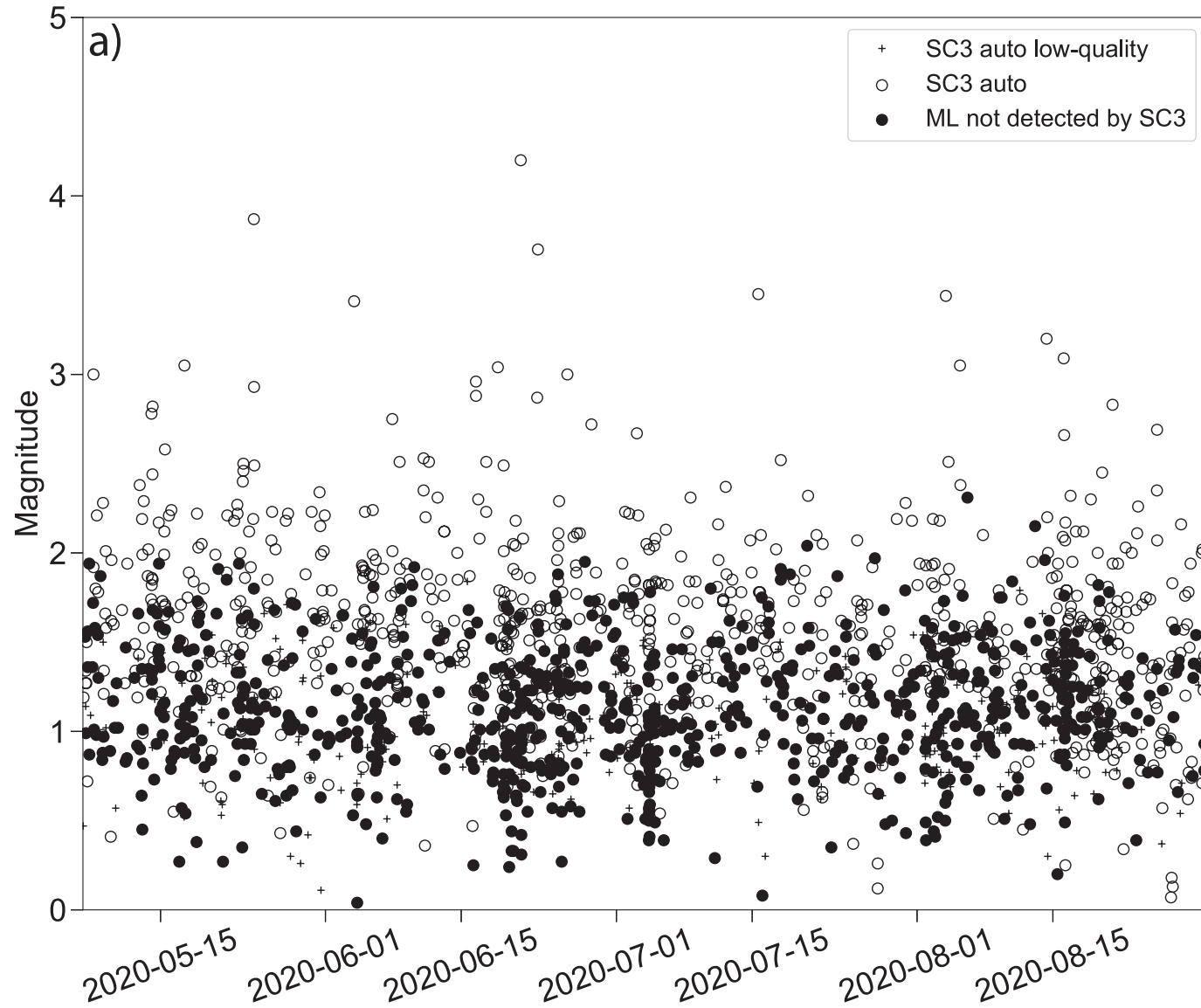
```
conda create -n easyquake python=3.7 anaconda
conda activate easyquake
conda install tensorflow-gpu==2.1
conda install keras
conda install obspy -c conda-forge
pip install easyQuake
```

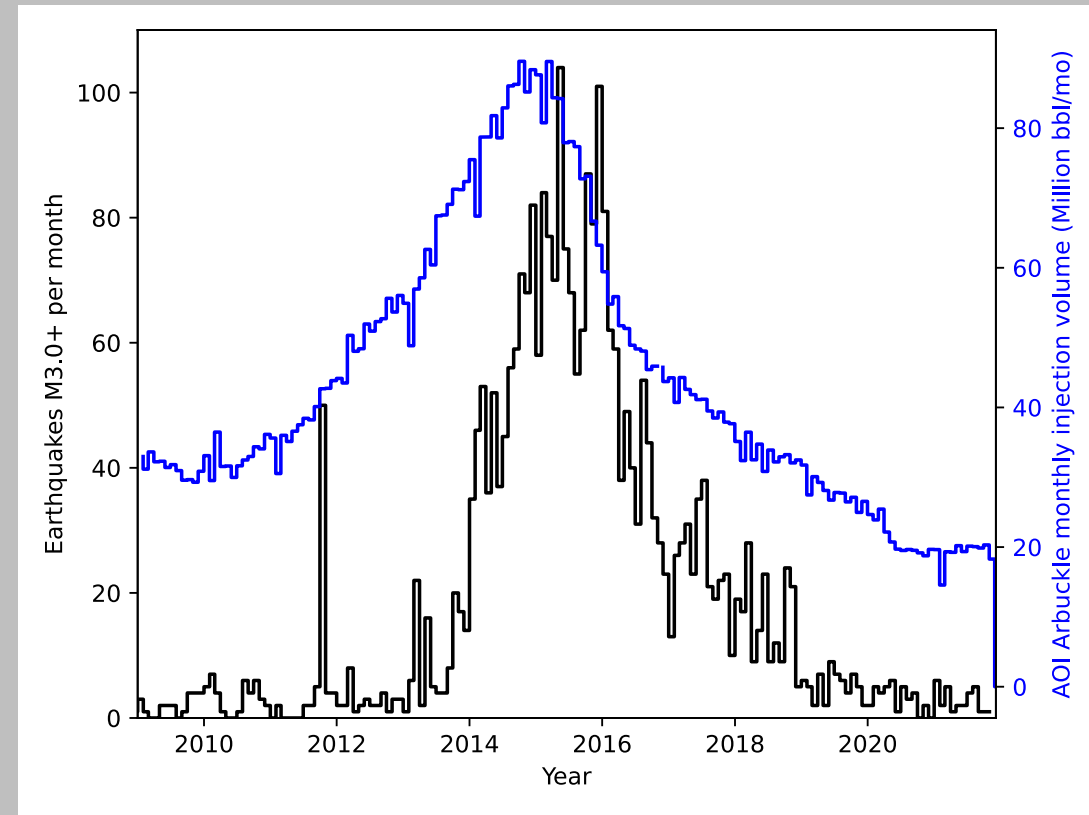
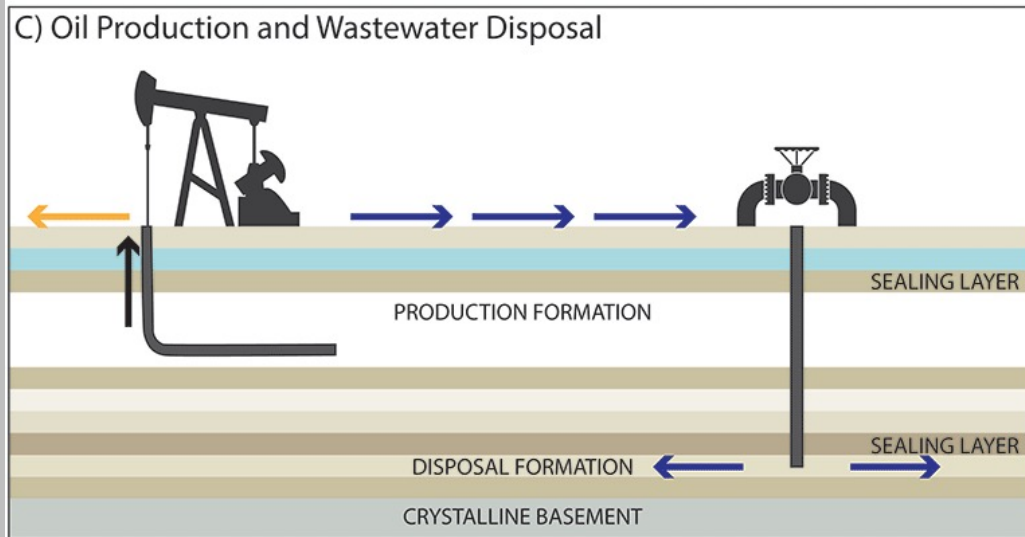
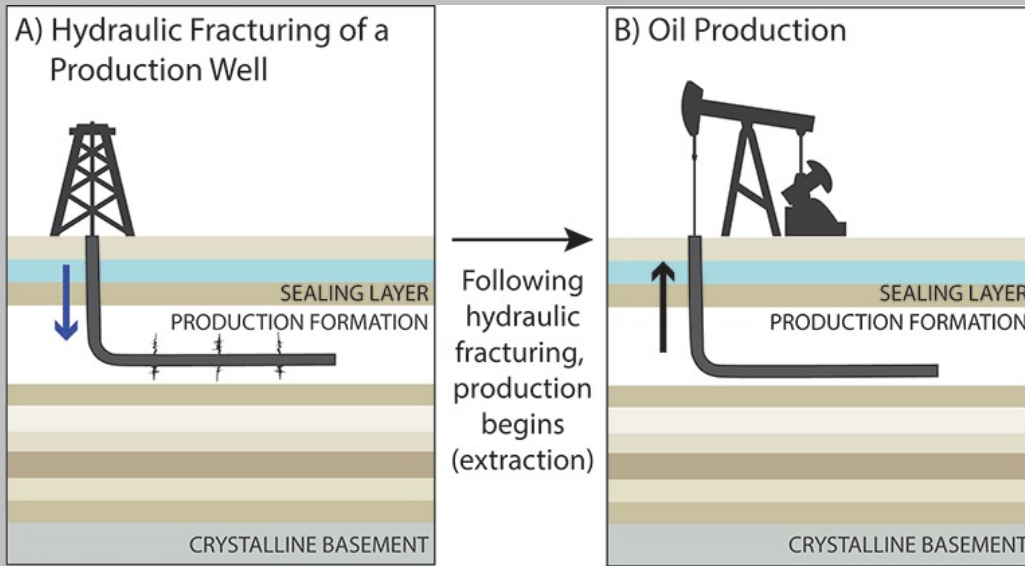
Email me: jwalter@ou.edu

Walter, J. I., P. Ogwari, A. Thiel, F. Ferrer, and I. Woelfel (2021), easyQuake: Putting machine learning to work for your regional seismic network or local earthquake study, *Seismological Research Letters*, <https://doi.org/10.1785/0220200226>.

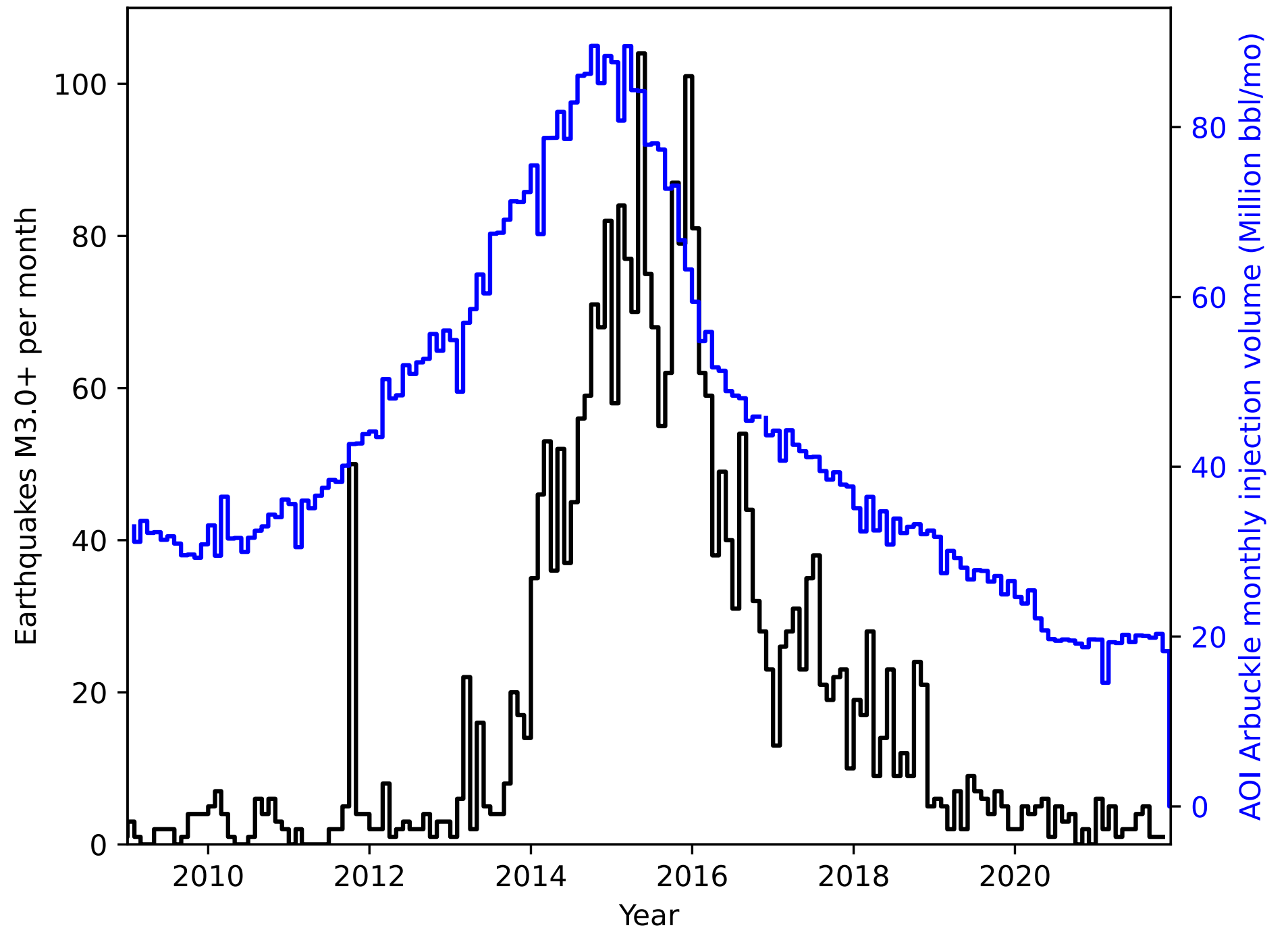
Future: near real-time and expanding modularity (new pickers, direct hypoDD or HASH functionality rather than just producing outputs, plotting, statistics)

Machine-learning/AI to find smaller earthquakes





Arbuckle Group in Oklahoma



Walter et al., 2020

- November 2011 – Magnitude 5.7 near Prague, OK
- September 2016 – Magnitude 5.8 near Pawnee, OK
- November 2016 – Magnitude 5.0 near Cushing, OK





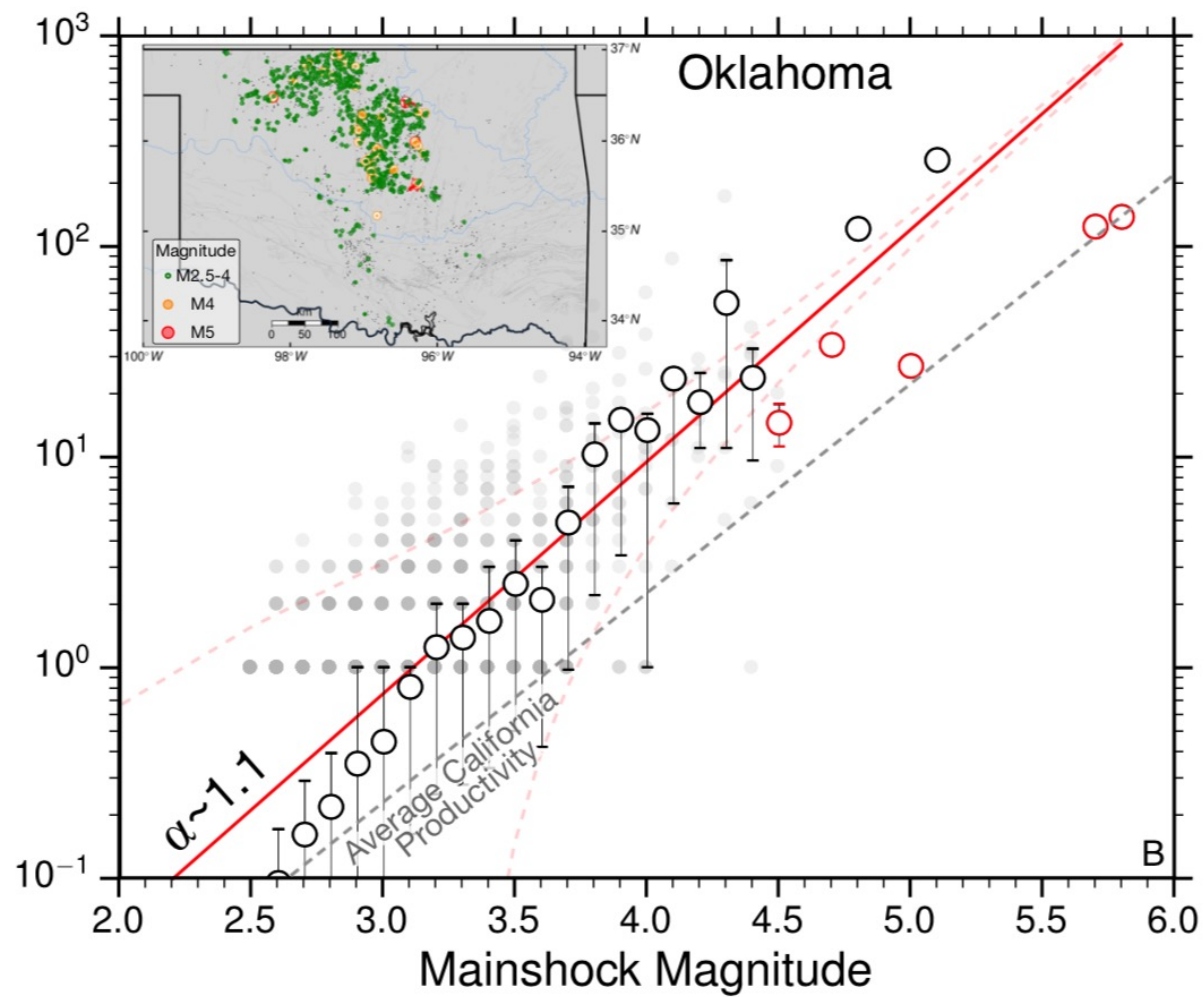
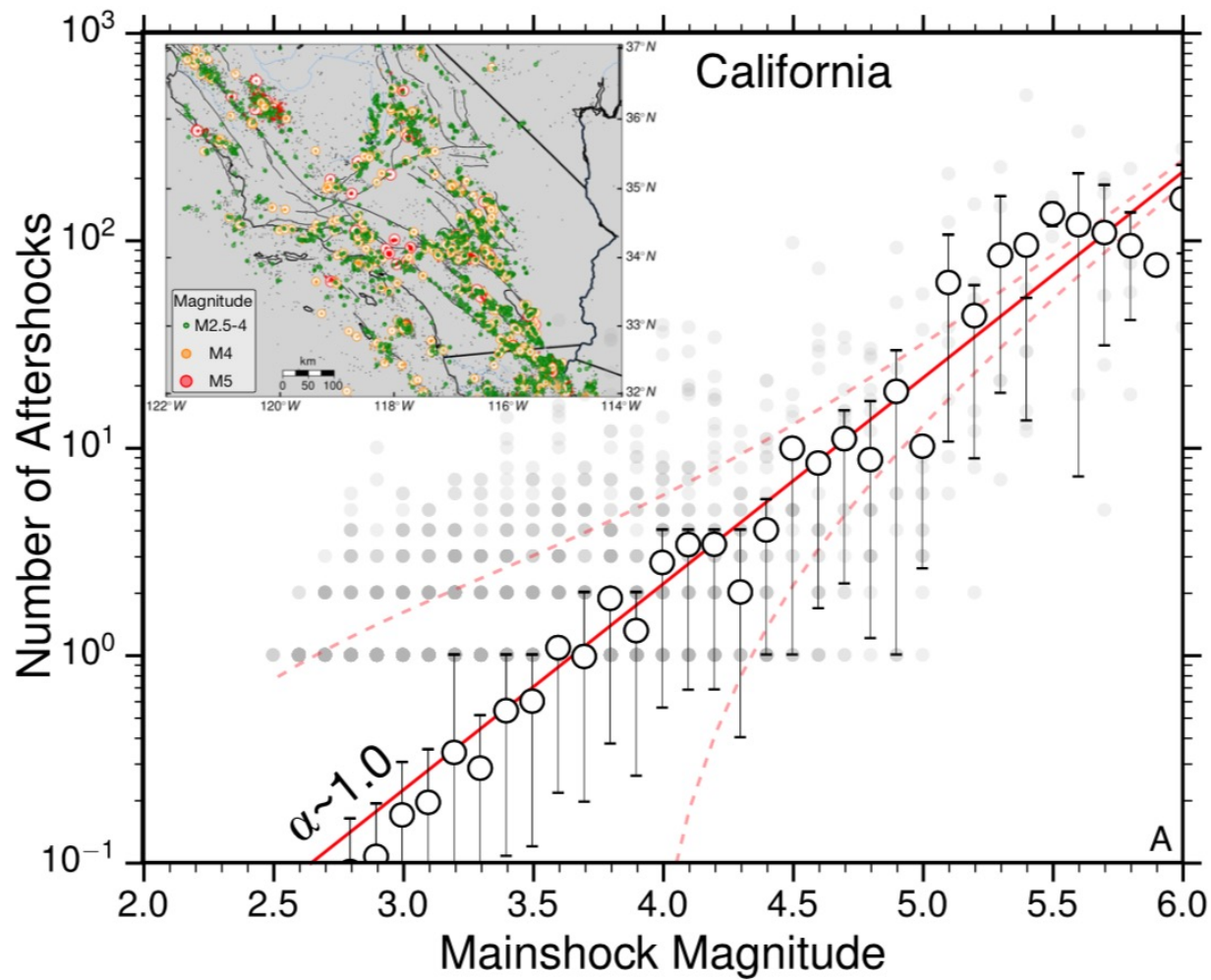
OKLAHOMA EARTHQUAKES

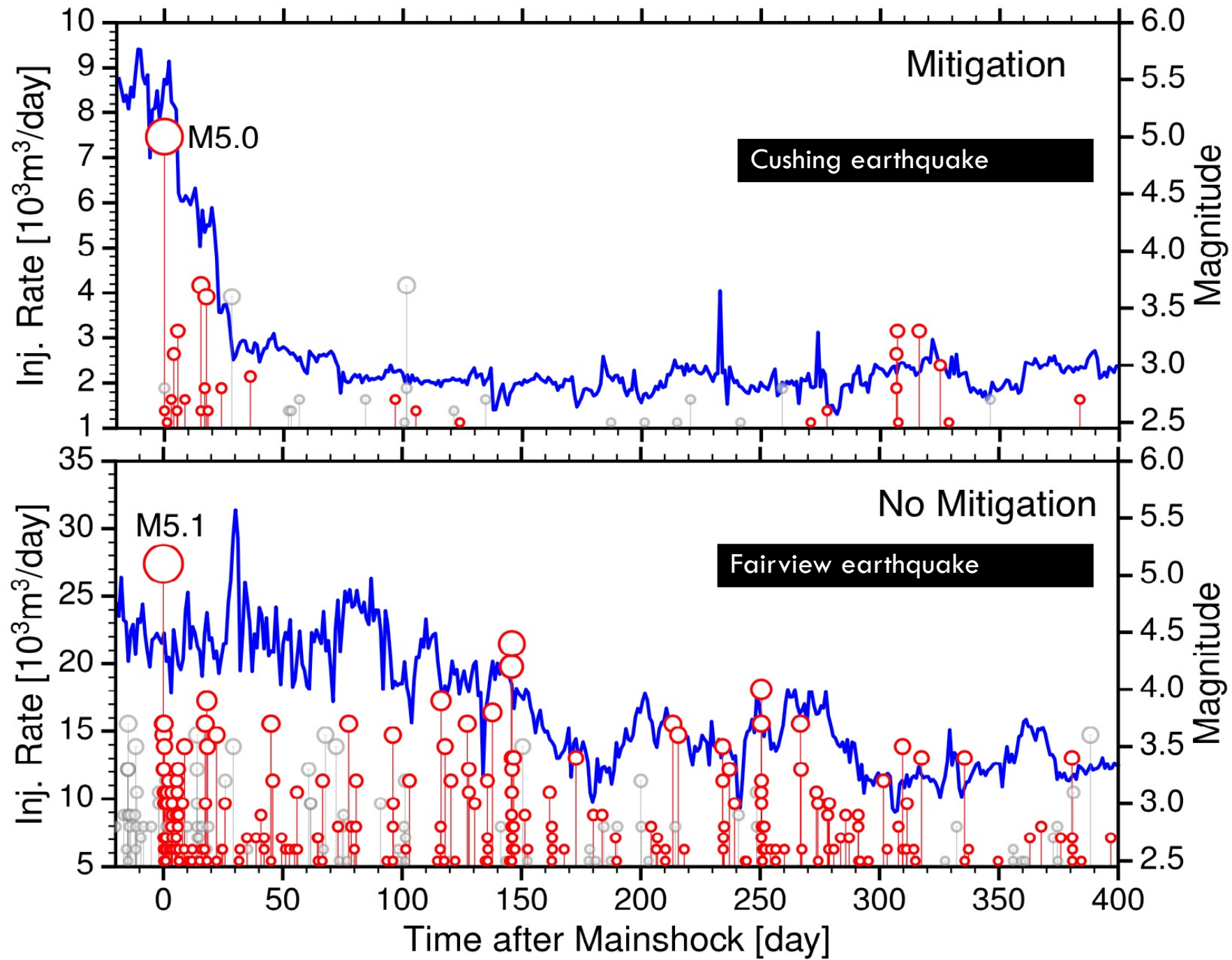
OCC: SHUTTING DOWN WELLS, REDUCING VOLUME

THE LATEST

FOX 23
NEWS

5:01
62°





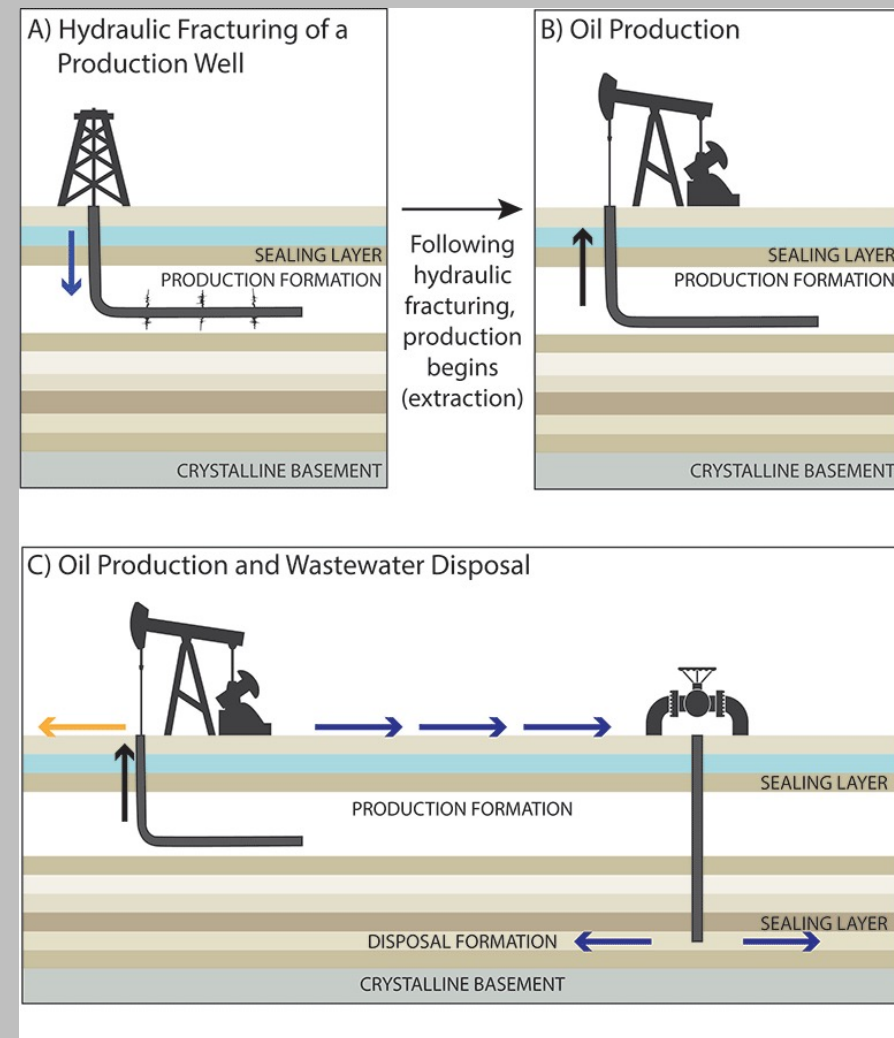
Lessons from mitigating wastewater disposal seismicity

High volume disposal more likely seismicity (Weingarten et al., 2015; Walsh and Zoback, 2016)

Proximity to faults (Darold and Holland, 2015; Alt and Zoback, 2017) and basement (Hincks et al., 2018)

Rapid shut-in reduces aftershock activity by plausibly reducing poroelastic stress (Goebel et al., 2019)

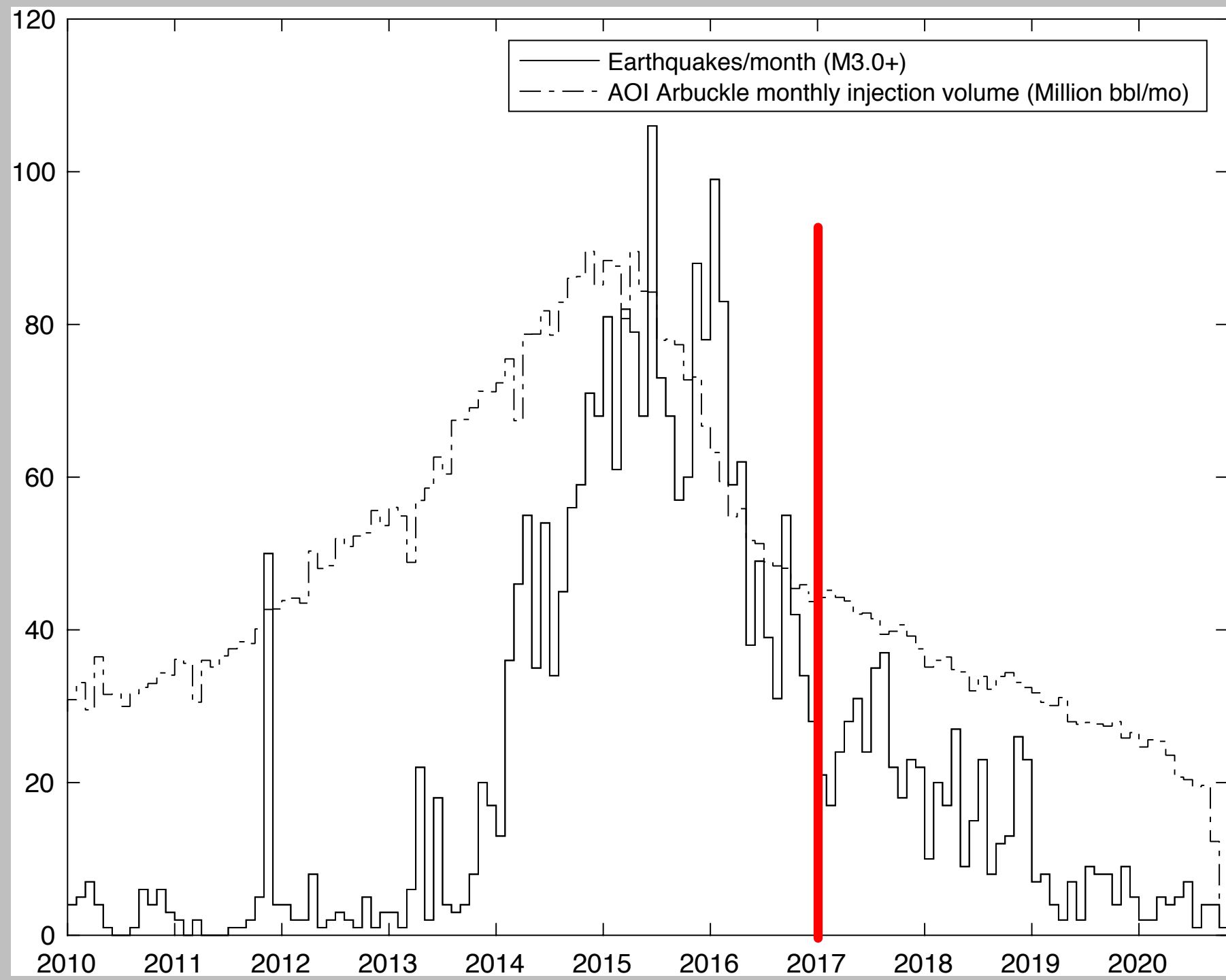
Long-term regional reduction in wastewater disposal in Arbuckle driven by market and regulatory factors



Rubinstein and Mahani, 2015

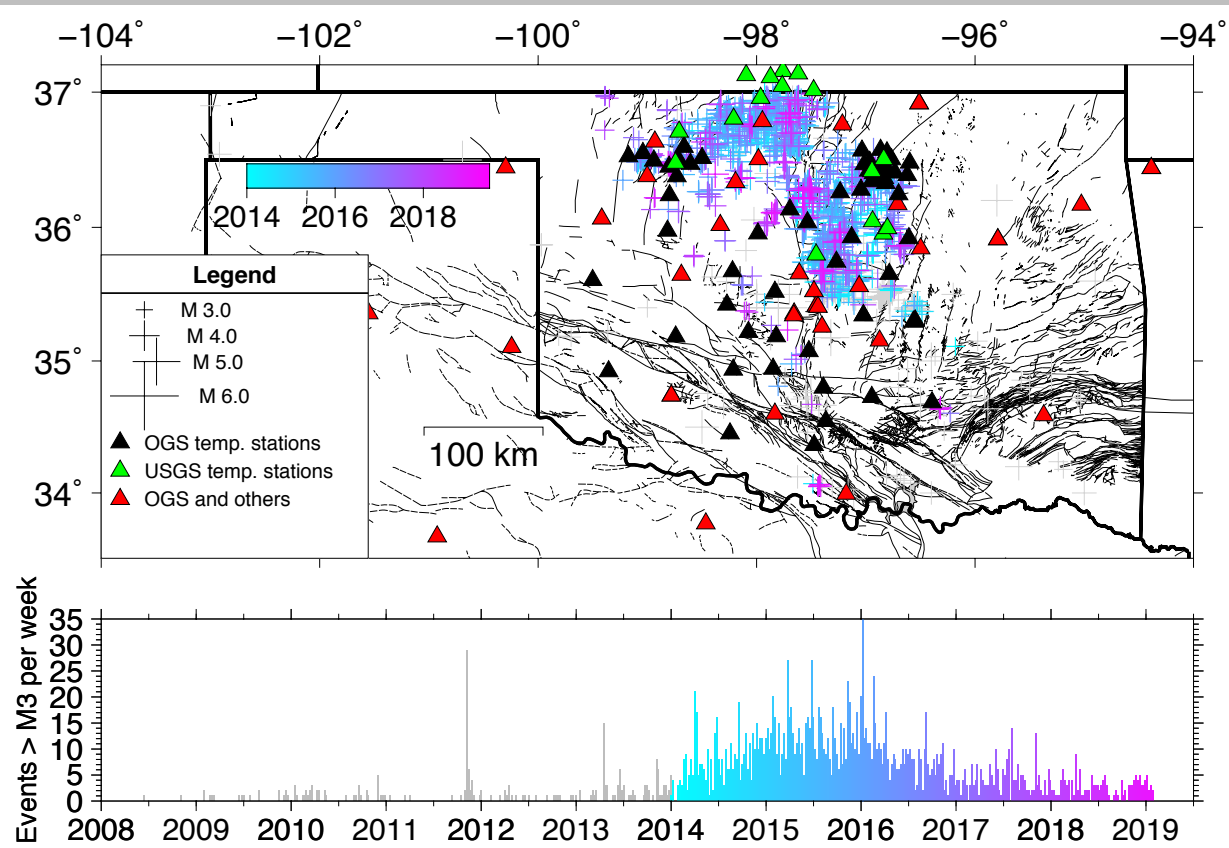
Holland, 2013 – HF triggered seismicity in S Oklahoma

Skoumal et al., 2018 – results from this paper were available in 2016 suggesting HF triggered seismicity common across wide swath of SCOOP/STACK

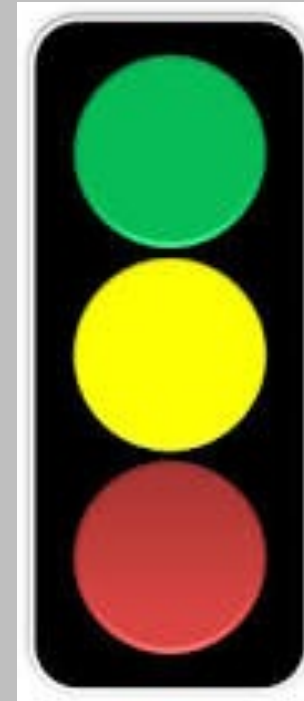


Oklahoma Geological Survey

Oklahoma Corporation Commission



Oklahoma Corporation Commission Protocol for earthquakes associated with well completions, as tracked by their FracNotice (issued Dec 20, 2016, since updated)



SUMMARY OF WELL COMPLETION SEISMICITY GUIDANCE

Terms: Oil and Gas Conservation Division (OGCD)
Oklahoma Geological Survey (OGS)

M2.0

Action following anomalous seismic activity within 1.25 miles of hydraulic fracturing operations:

- If magnitude, as determined by the OGS, is greater than or equal to 2.5M:
 - OGCD contacts designated representative for the operator with active completion operations within a 2 km radius of located seismic events.
 - Implementation of the operator's internal mitigation practices commences.
 - Operation continues.
- If magnitude is greater than or equal to 3.0M:
 - Operator initiates a pause of operations for no less than 6 hours.
 - Technical conference/call held between the OGCD staff and operator about operator mitigation practices.
 - Upon agreement between operator and OGCD regarding mitigation practices and reduced seismic activity, operator permitted to resume with revised completion procedure.
- If magnitude is greater than or equal to 3.5M:
 - Operator suspends operations
 - In-person technical conference held with OGCD staff and operator to examine whether operation can resume with changes.

M2.5

M3.0

Data caveats for OGS analysis for HF association

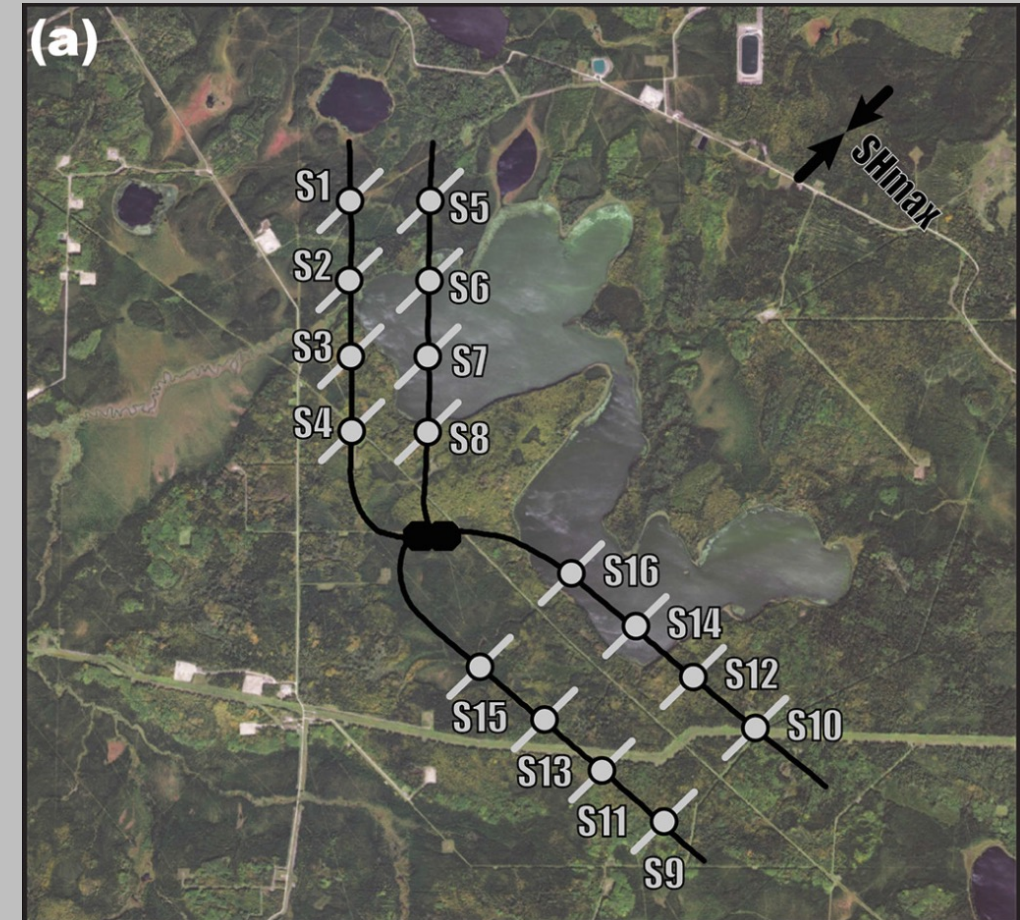
OCC FracNotice (since Dec 2016) began requiring operators to provide at least 48 hours notice of HF completion and intended duration, # of stages, volumes

OCC uses OGS real-time catalog to determine their own spatial/temporal association according to the directive

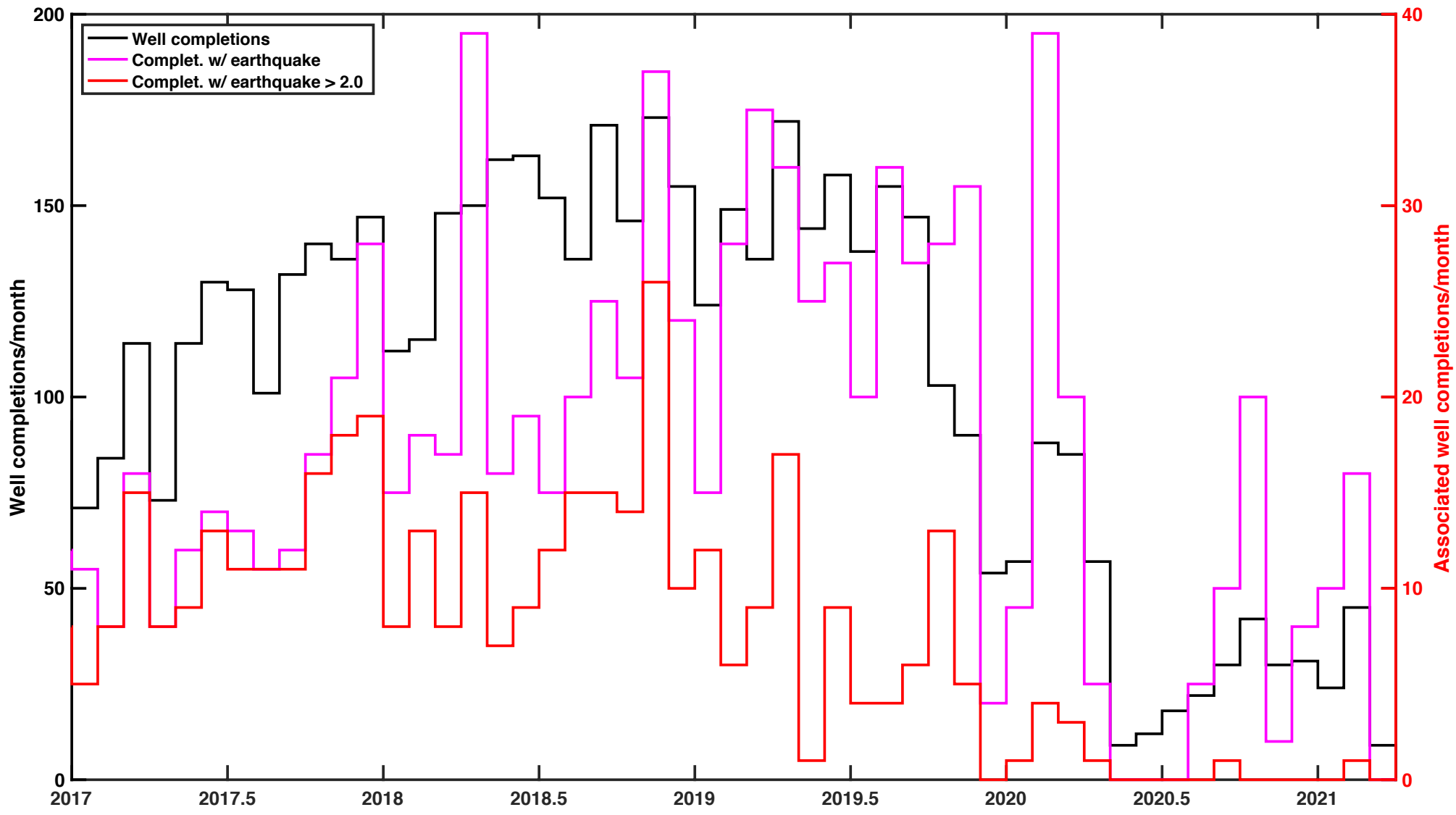
OGS expanded the network into western and southwestern Oklahoma in late 2016/early 2017

OGS participates in technical conferences with OCC on occasion or investigates specific case studies

OGS does not have access to real-time denser private networks in the area



Schultz et al., 2020

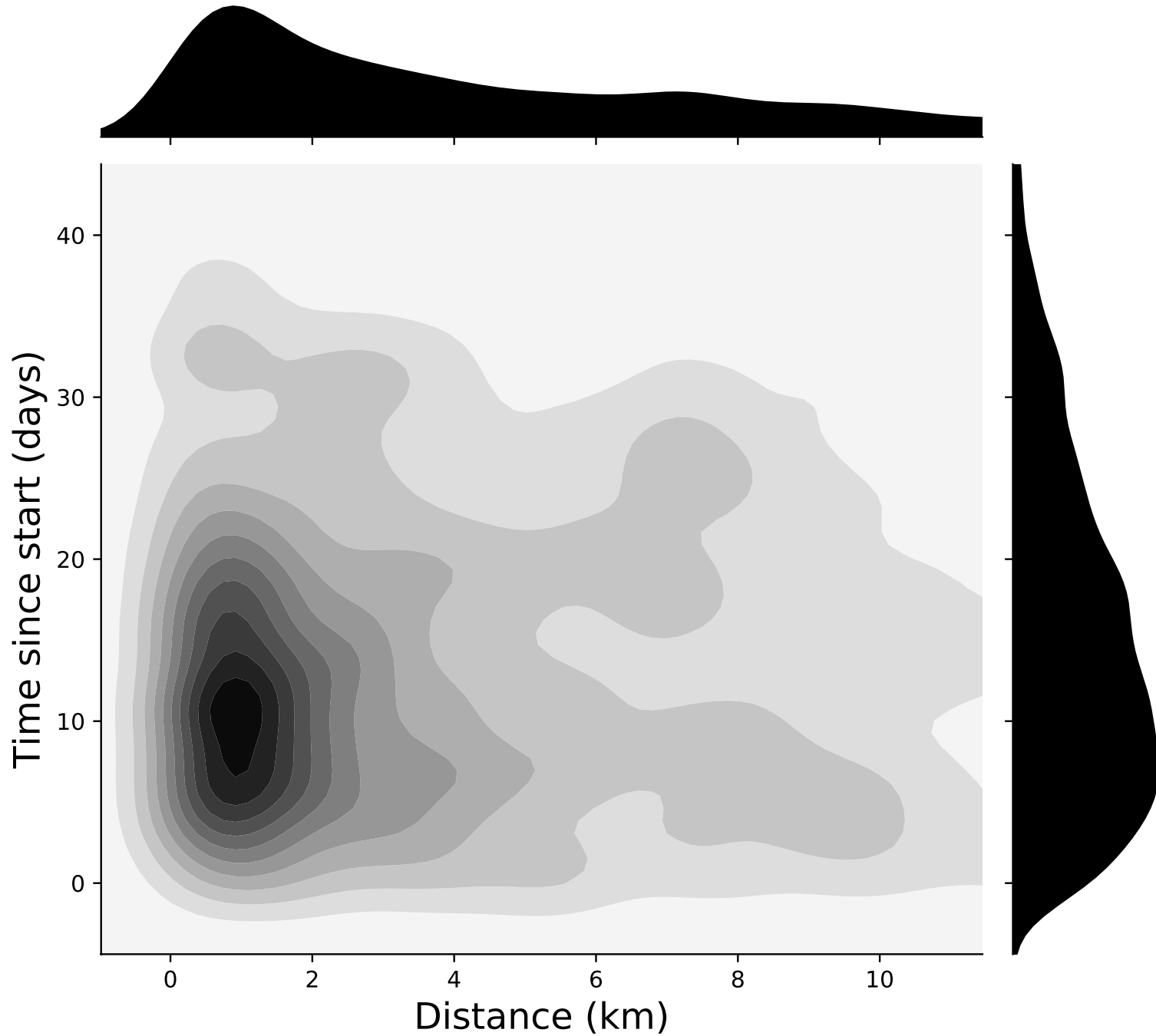


Black
HF wells

Pink line
All quakes

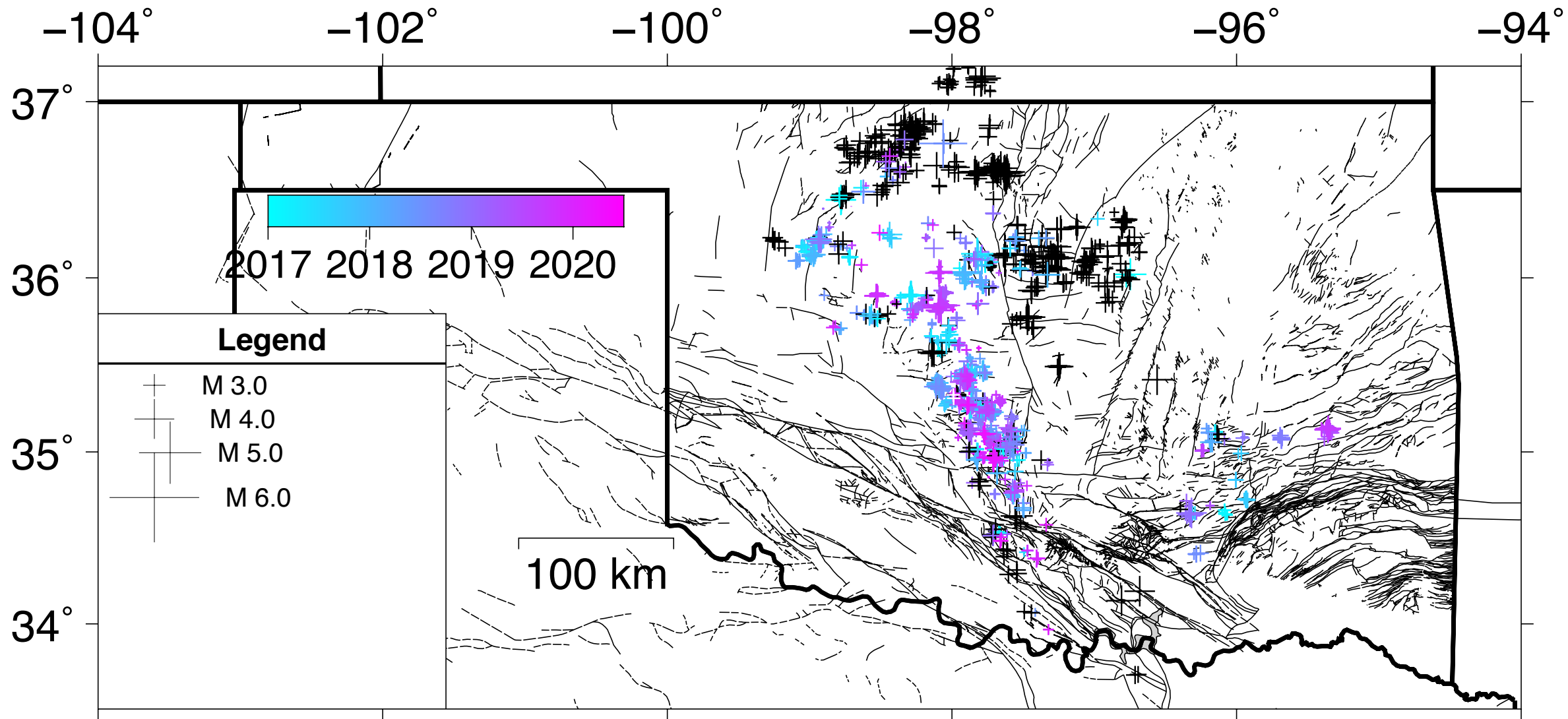
Red line
M2.0+

Monthly HF and HF-associated activity

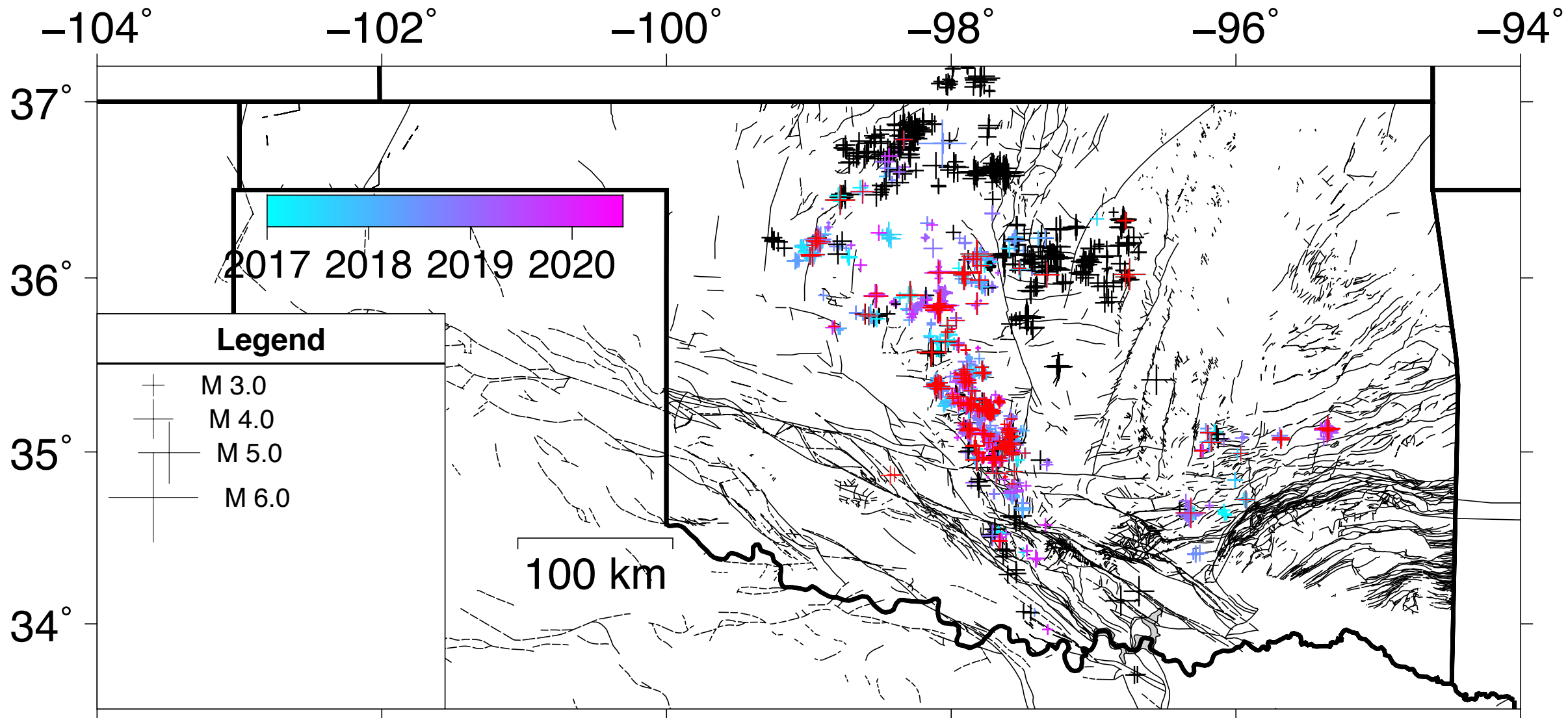


Time and radial distance of seismicity during HF with 20 day buffer afterwards

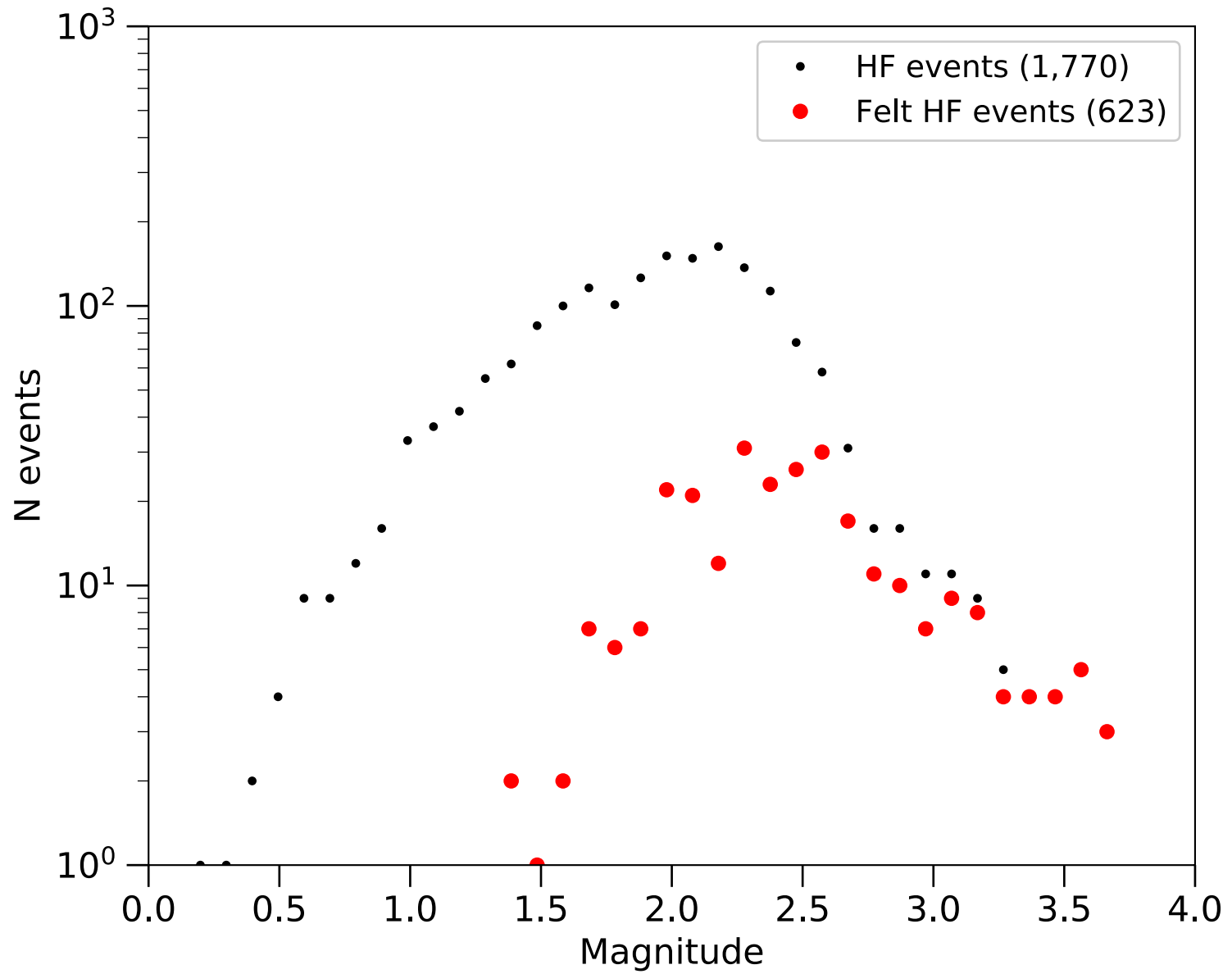
4 km and 20 days is a conservative estimate

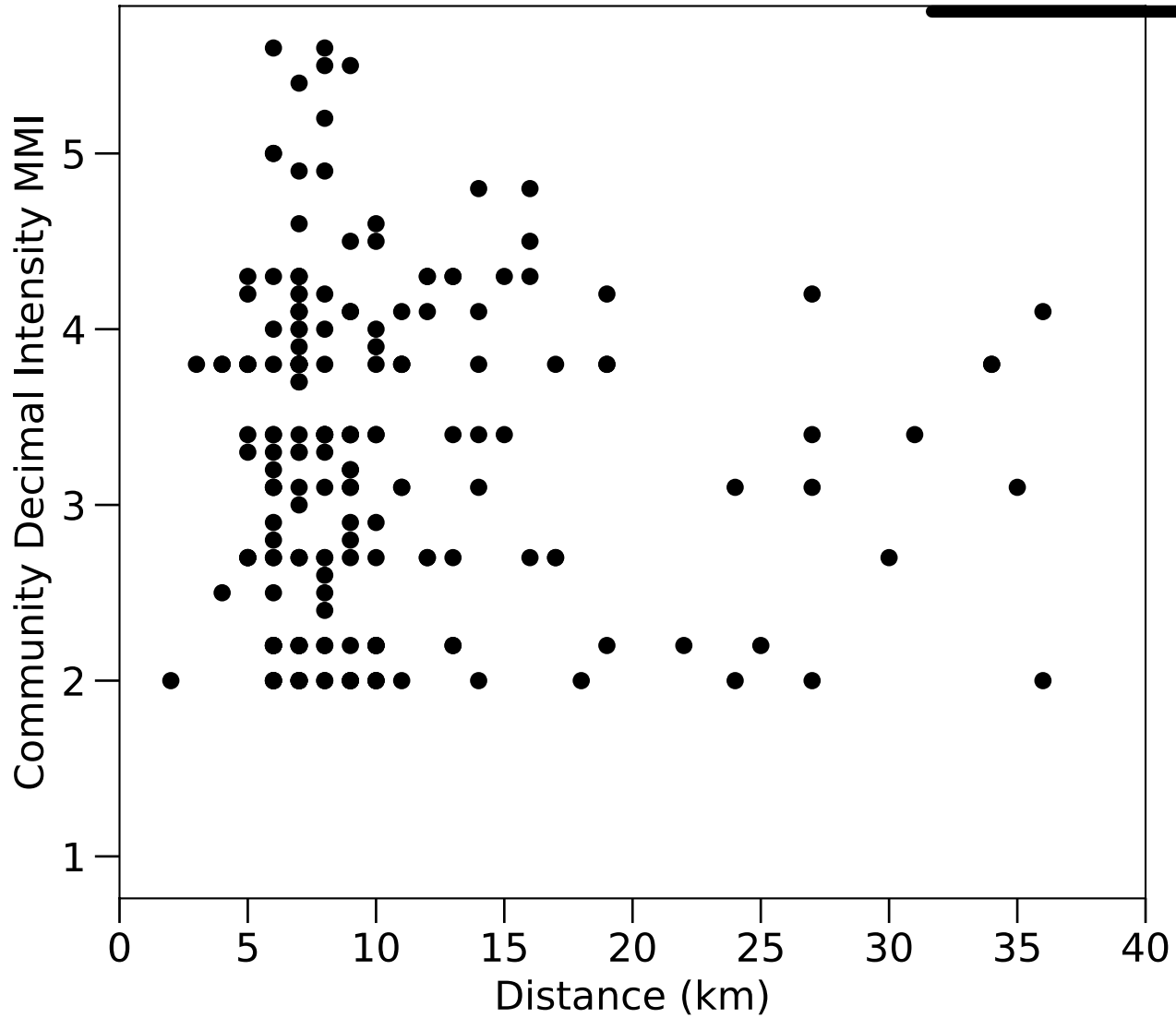


HF-associated activity

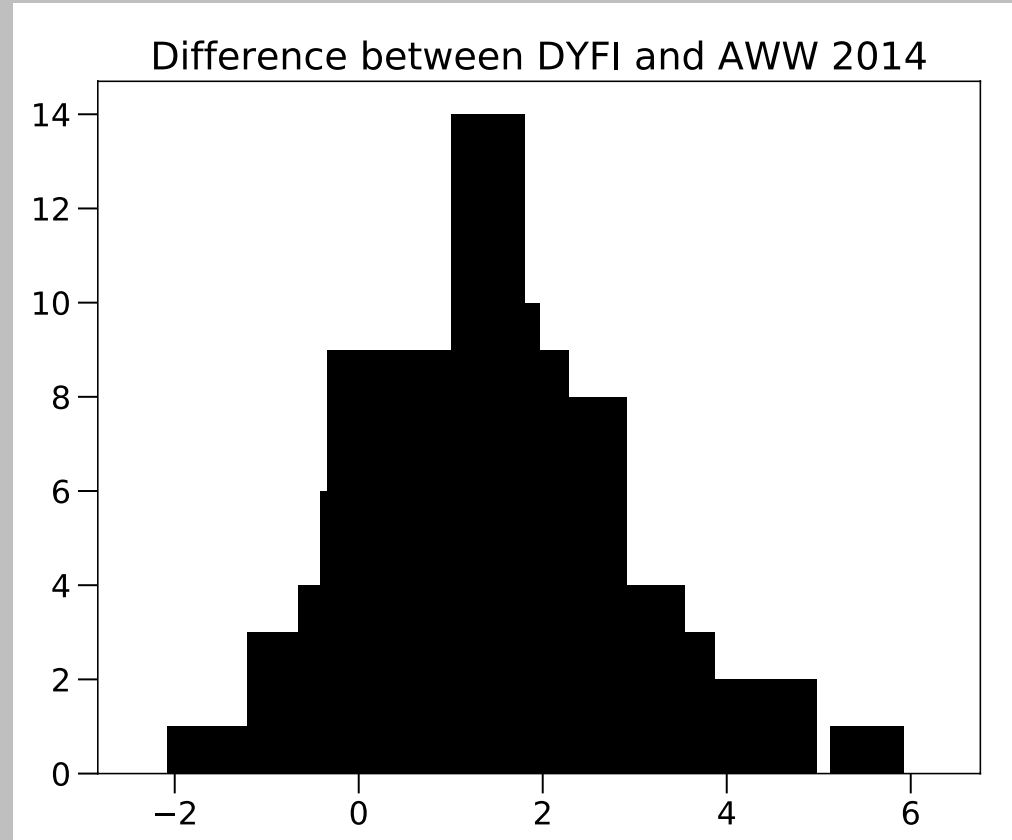


HF-associated activity (red DYFI or "felt" events)





Light damage threshold



Simple spatio-temporal association at 4 km and 20 days in time

Out of 5,404 completions since Oct 2016:

515 frac or about 9% associated with earthquake of any size

194 frac were associated with a felt event (from DYFI) or about 4%

Largest earthquake(s) M3.6

Interesting anecdotes: Potential damage from a M3.2 HF-triggered earthquake and felt reports from M1.8 earthquakes



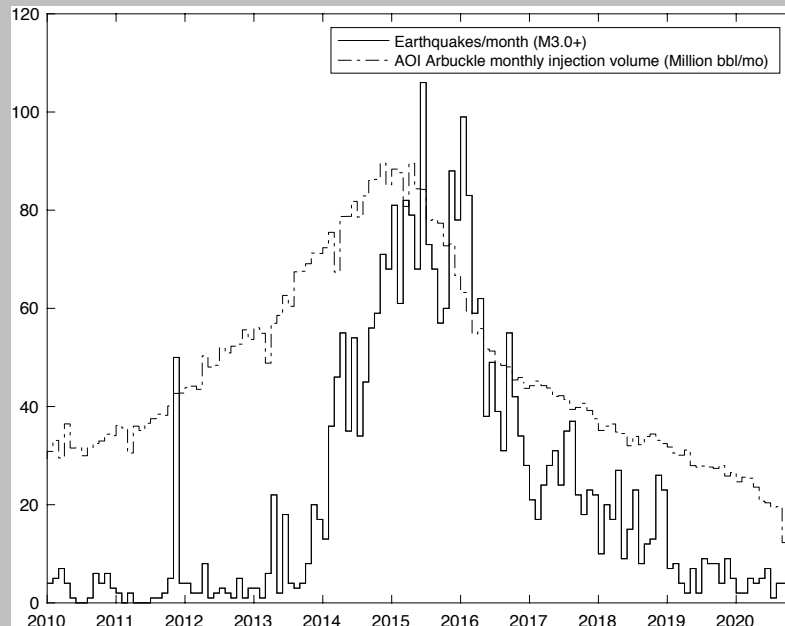
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Hydraulic fracturing – injection occurs over days, mitigation on hours



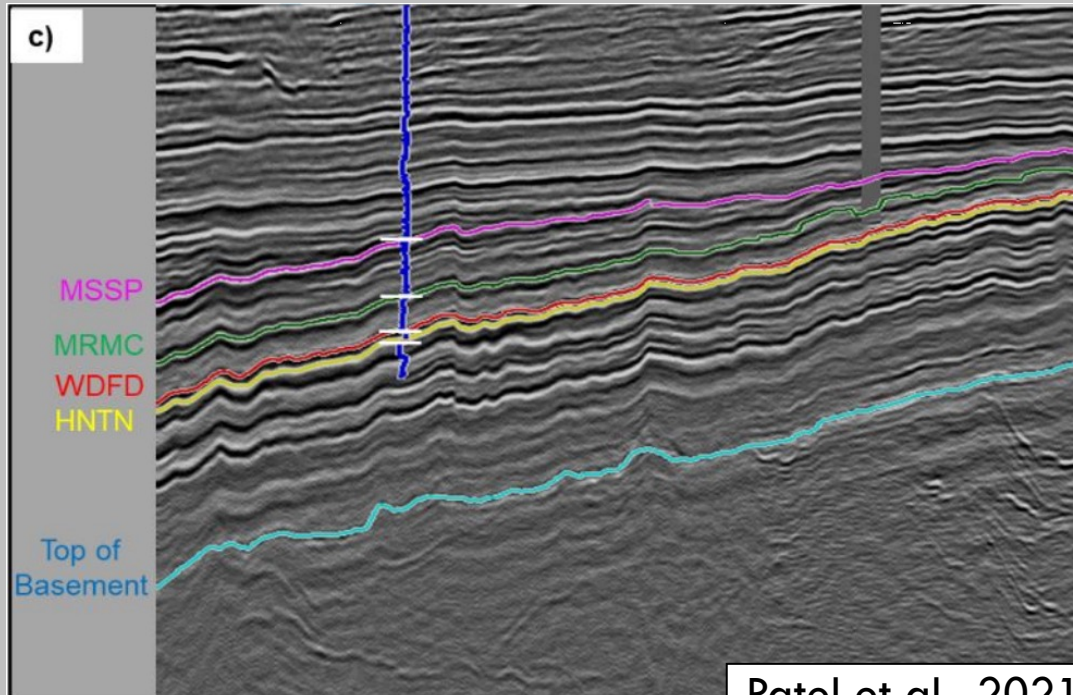
Wastewater injection - injection for several years, mitigation for several years?

Rapid mitigation appears to successfully reduce aftershock productivity

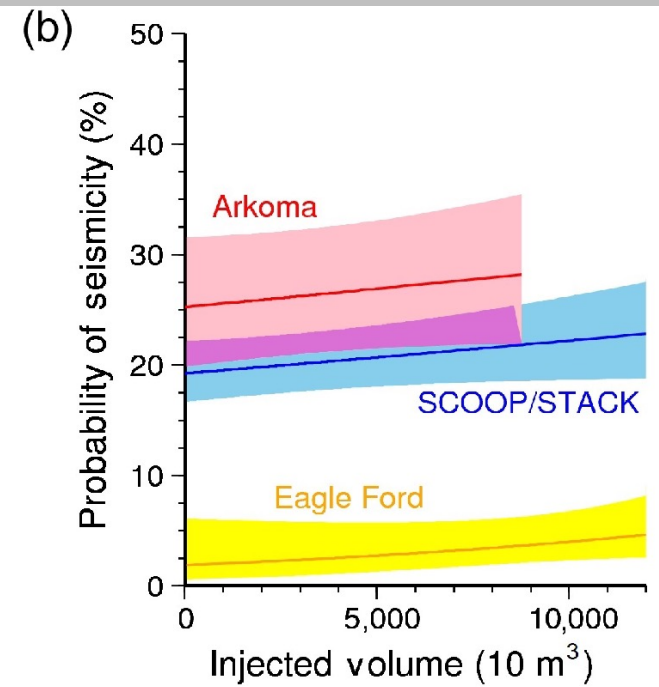
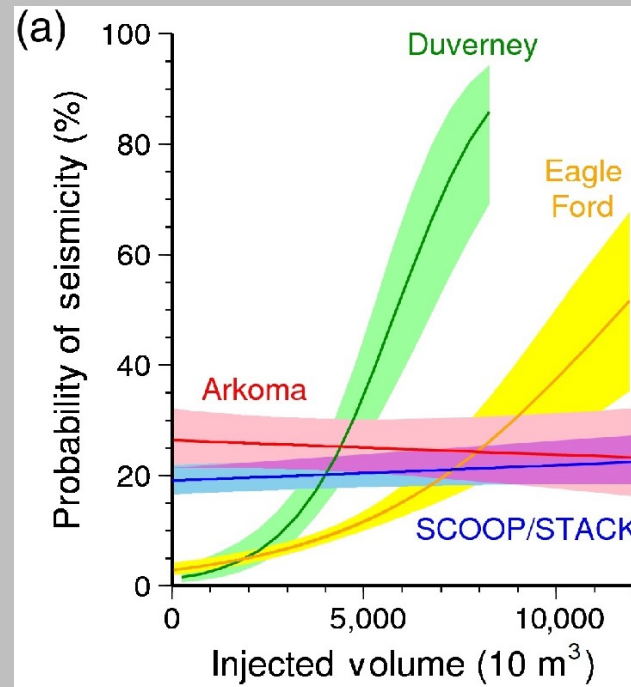
Causal factors?

No strong dependence upon volume

Geology?



Patel et al., 2021



Ries et al., 2020

Swetal Patel's recently published work from 3D seismic attributes suggests basement structures extend into the sedimentary column

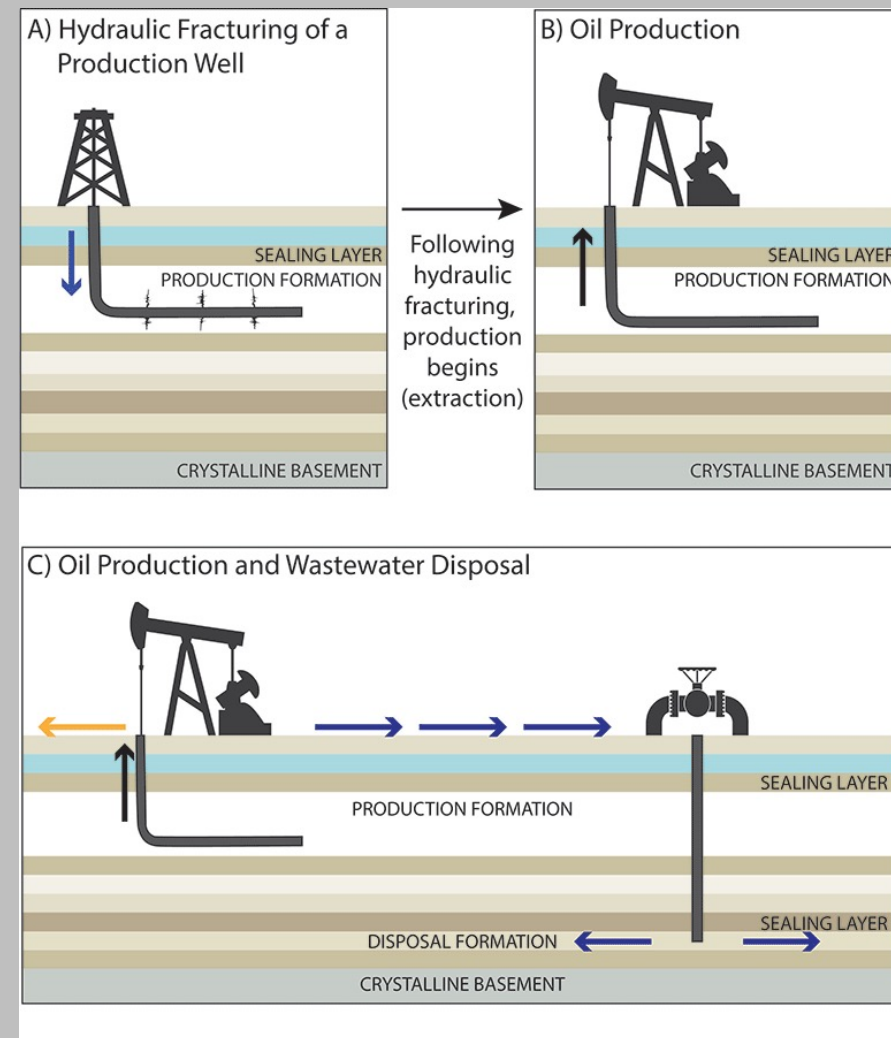
Lessons from for mitigating wastewater disposal seismicity hydraulic-fracture triggered seismicity

Volume - No clear dependence on volume (Ries et al., 2020)

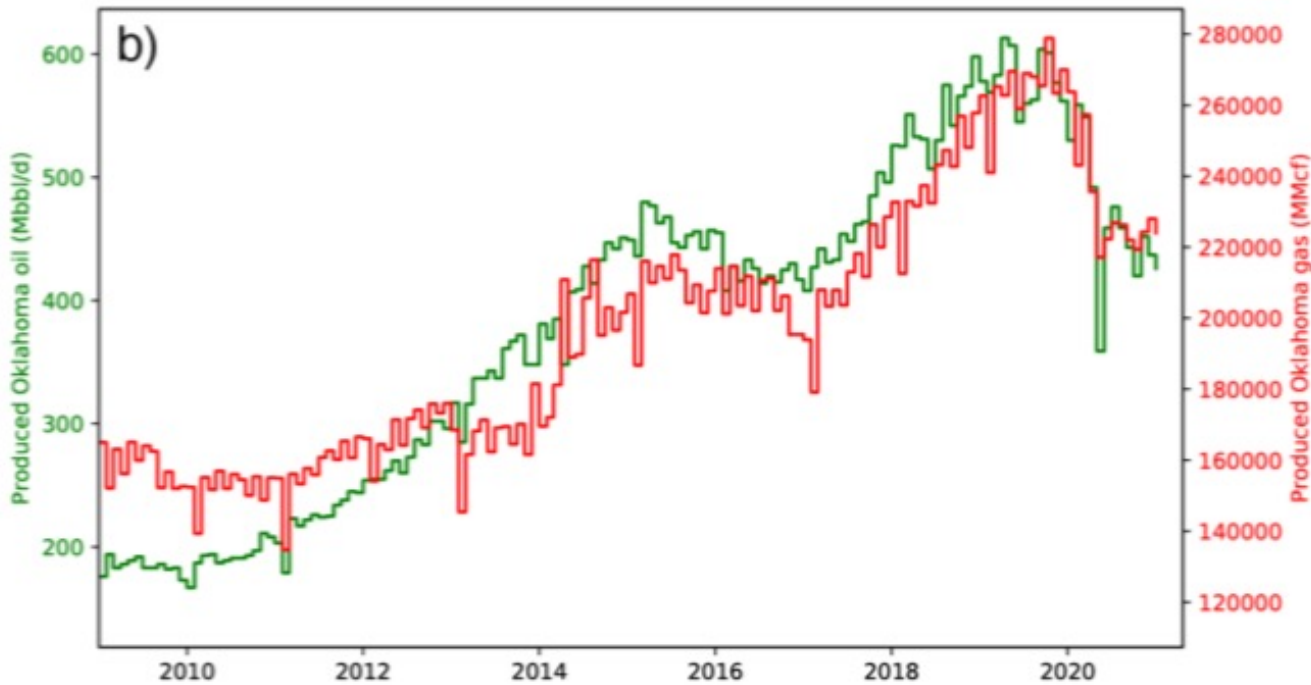
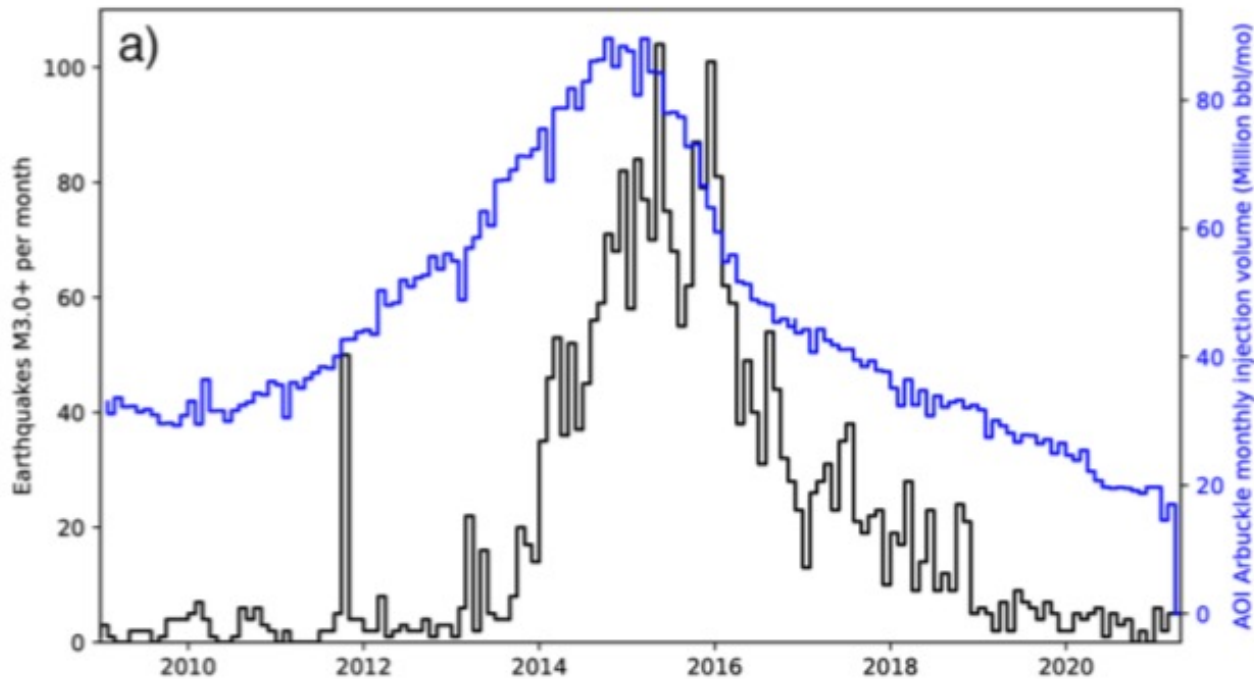
Geology and faults – Seismogenic structures visible in seismic attributes, though subtle (Patel et al., 2021)

Rapid mitigation – traffic light pauses seem effective in reducing damaging events, operators report anecdotal success at implementing traffic light approaches set at 1 magnitude unit below the regulatory one

Safety conscious proactive approach seems to have led to Oklahoma increasing production of both oil and gas relative to 2014/2015 production levels, without the accompanying damaging earthquakes during that past time period



Rubinstein and Mahani, 2015



Large earthquakes are rare, but have incurred ~\$10 million damage total (claims paid in Oklahoma), likely an underestimate of actual damage

(\$74 million in gross production taxes collected in September 2019)

OGS Fact Sheet No. 1
*Geological Carbon
Management
in Oklahoma*



**The
Oklahoma Geological
Survey
November, 2021**

- Requests for more insight into Carbon Capture in Oklahoma. OGS produced this fact sheet starting a new series (though there have been previous OGS fact sheets);
- Envisaged CO₂ trapping in regard to the storage estimates for OK geology;
- Primer on some of the jargon
- Available for download now: ogs.ou.edu

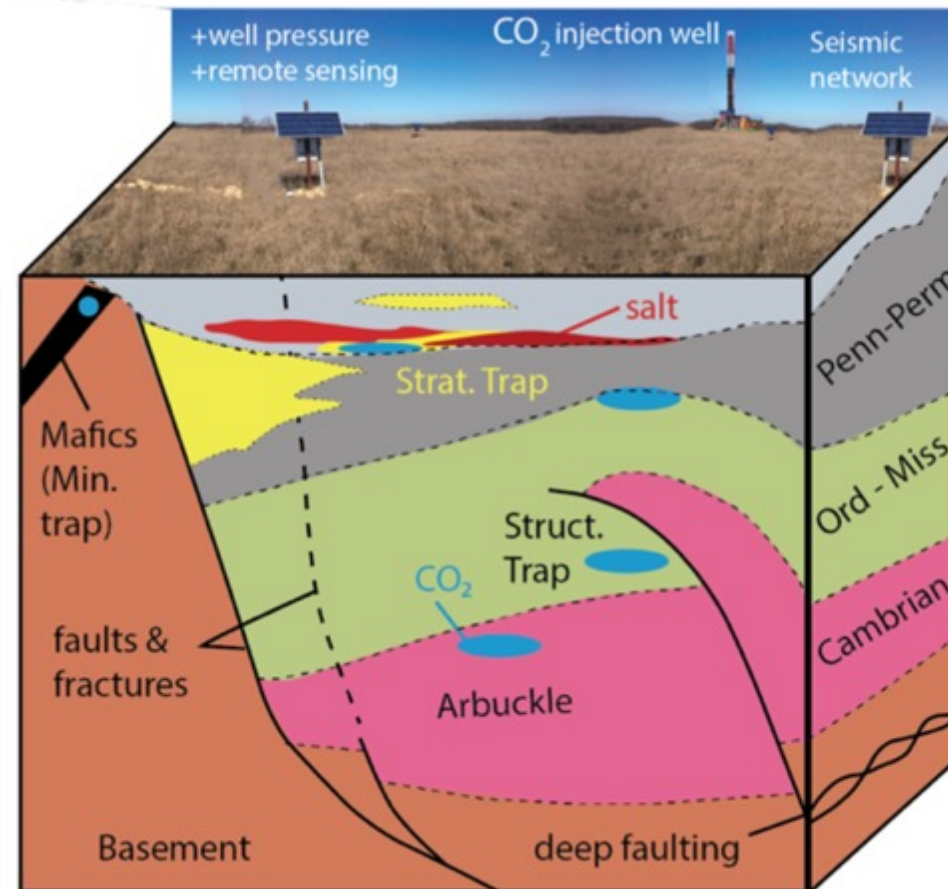


Figure 1. Schematic of carbon management targets in Oklahoma.

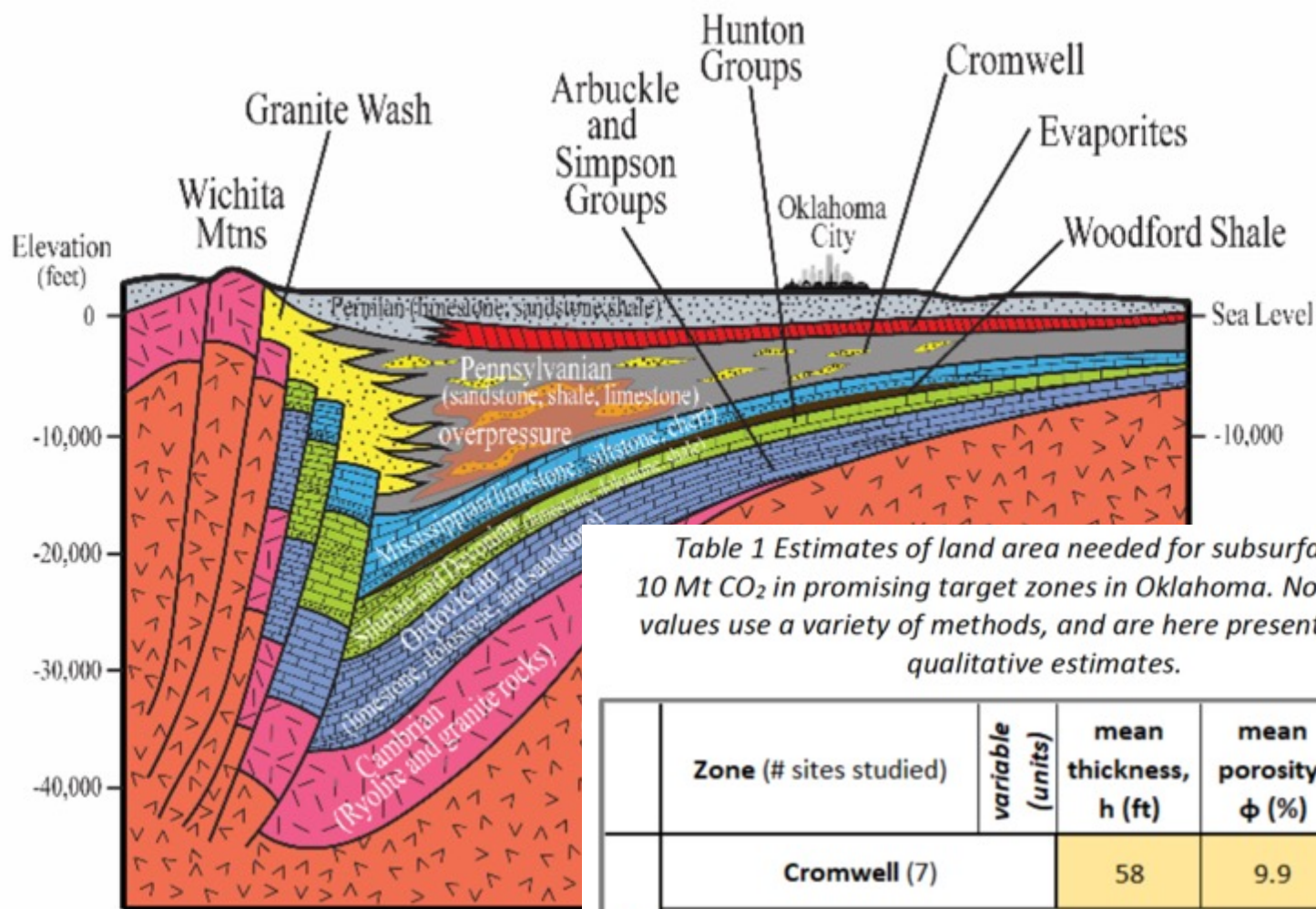
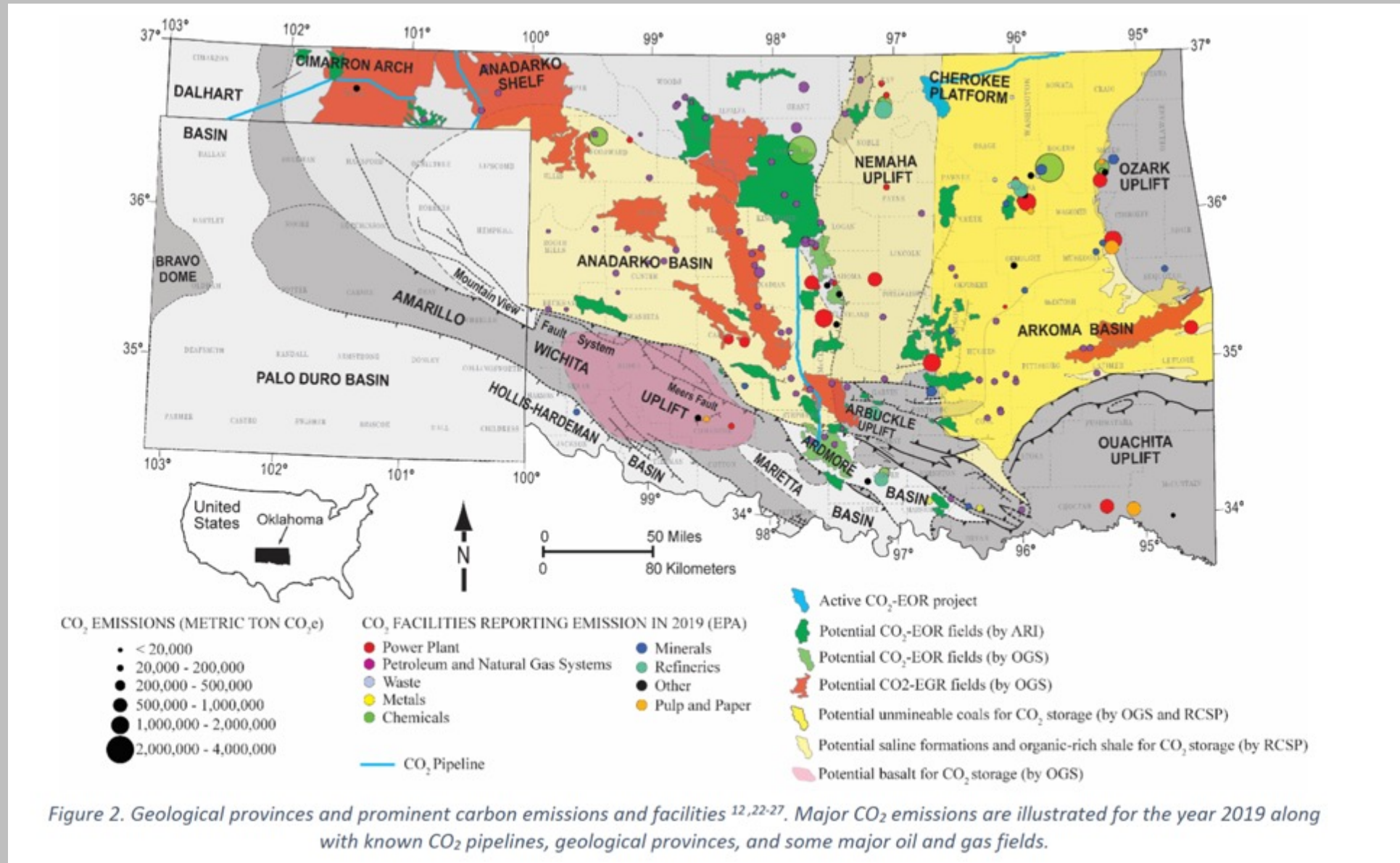


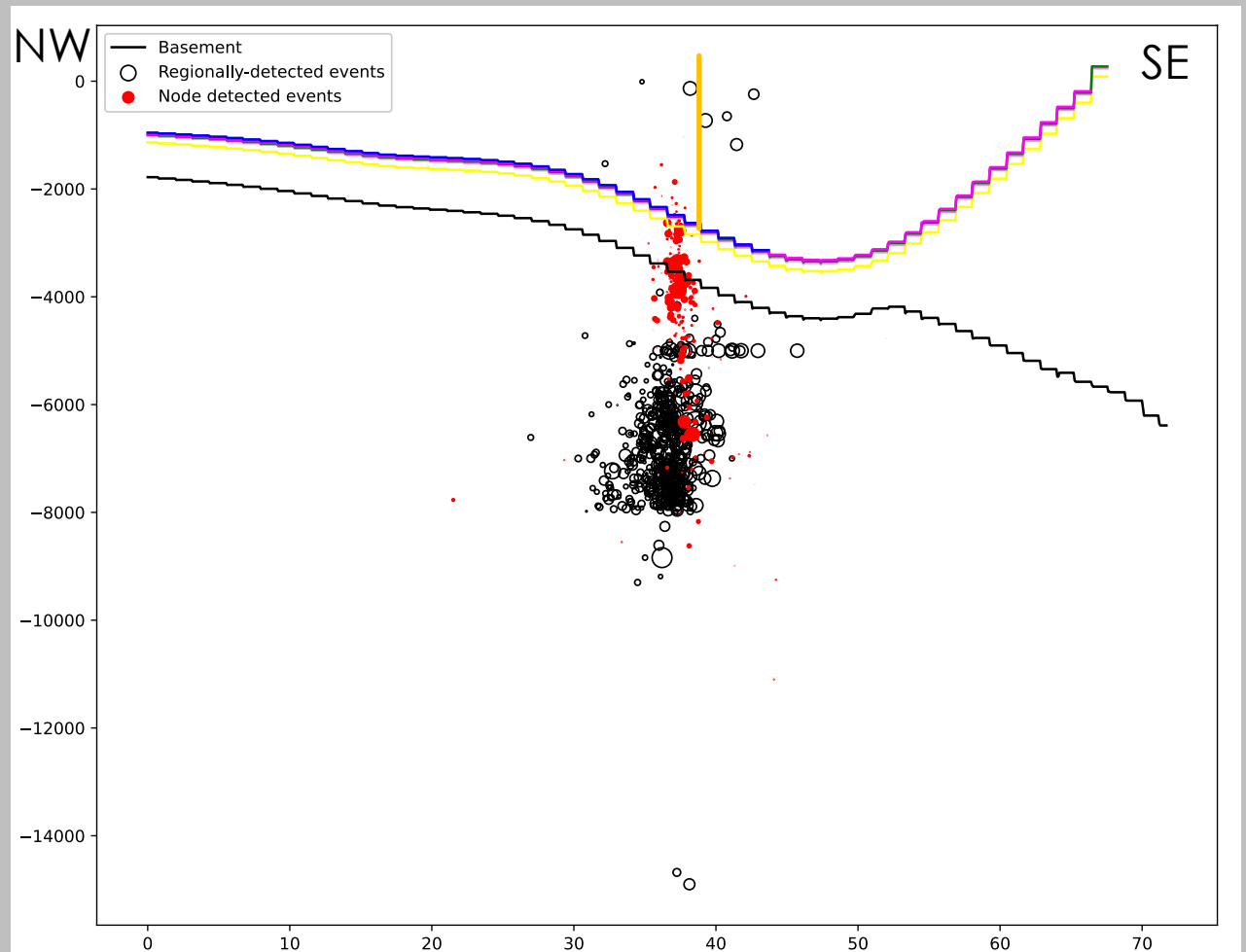
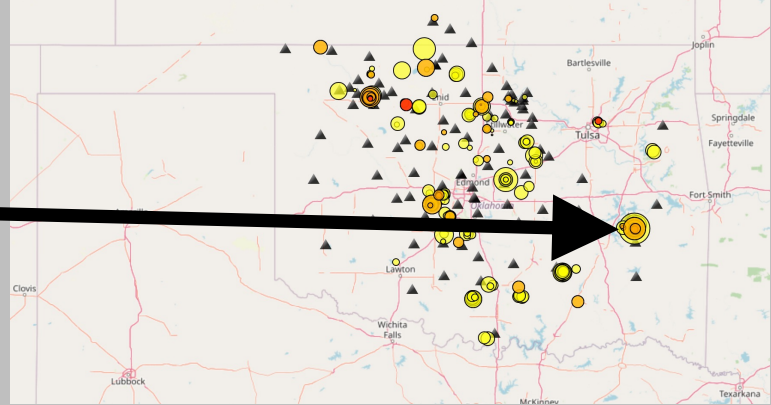
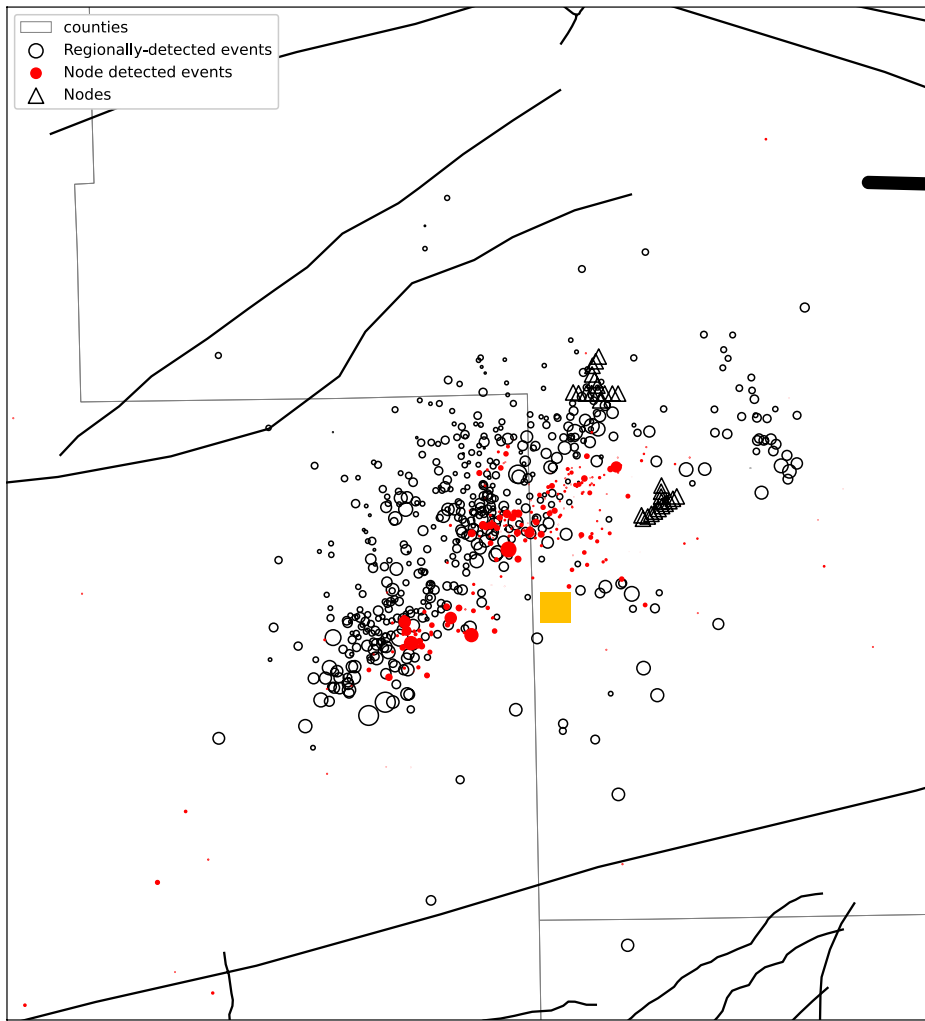
Table 1 Estimates of land area needed for subsurface storage of 10 Mt CO₂ in promising target zones in Oklahoma. Note porosity values use a variety of methods, and are here presented only as qualitative estimates.

	Zone (# sites studied)	variable (units)	mean thickness, h (ft)	mean porosity, φ (%)	CO ₂ area, A (acres)
Geological Zone	Cromwell (7)		58	9.9	5491
	Hunton Group (1)		160	16.0	1230
	Simpson Group (7)		147	10.7	2002
	Arbuckle (2)		432	7.1	1026
	Mafic or Precambrian (2)		1080	3.0	972
mean value from OGS geological studies					
calculated footprint required for storage of 10 Mt CO ₂					

Fact sheet quick estimate for 10 Mt storage areas for a few targets: Arbuckle continues to offer high storativity

Heterogeneous state geology with numerous EOR-CCUS opportunities, as well as large CCS opportunities





Combining ML-assisted event detection and node deployment for close-up view

- M3.7 in 2019 led to brief shut-in of disposal well and ~1,000 OGS-detected earthquakes since then
- During node deployment we detected 500+ earthquakes, while real-time network detected 89

Lessons from for mitigating wastewater disposal seismicity hydraulic-fracture triggered seismicity seismicity from long-term carbon storage/EOR

Volume – Probably dependent upon over long-term operation and large volumes

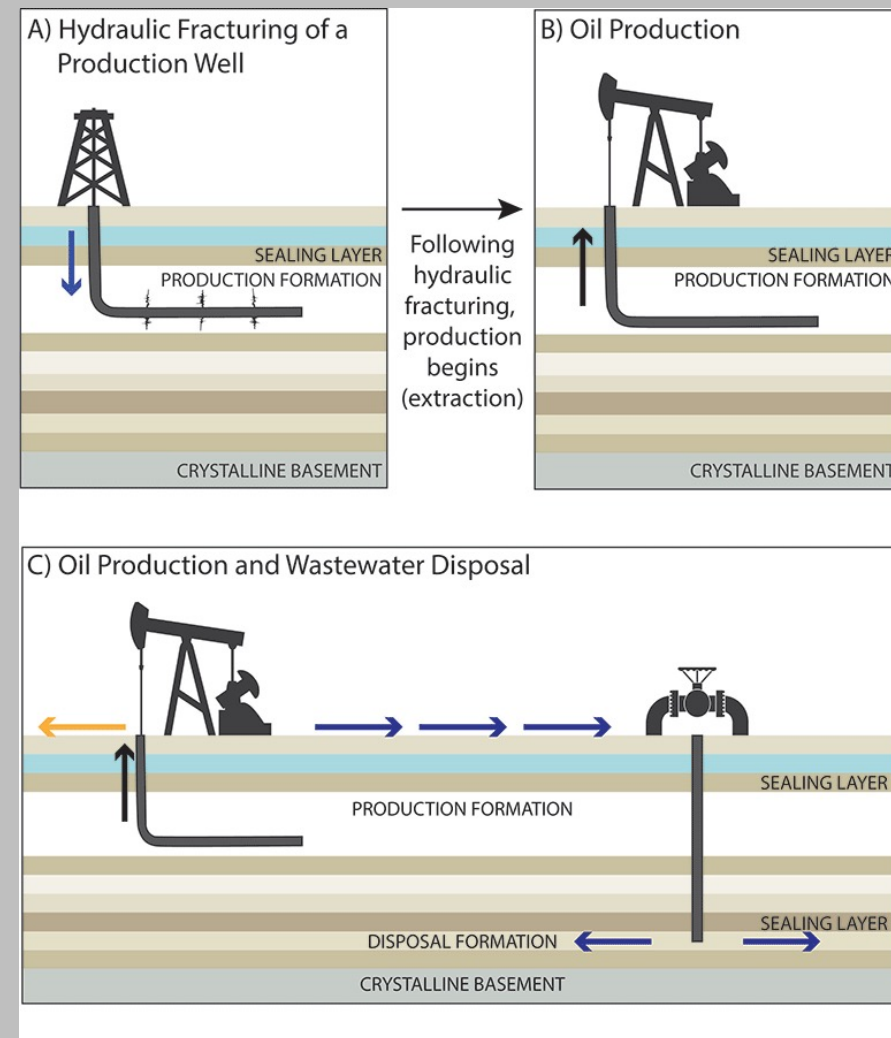
Geology and faults – planning operations to avoid large faults that are oriented for slip; FSP is not effective for planning purposes during permitting

Rapid mitigation – traffic light pauses or disposal shut-in may be effective on hours to days timescales

Clear industry/public agency communication channels and proactive planning can keep the social license to operate intact. When events happen, a clear understanding of the “reaction” (mitigation)

Clear need for comprehensive borehole and surface monitoring by trusted (public) agencies

Additional thoughts? – jwalter@ou.edu



Rubinstein and Mahani, 2015