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# Evaluating trends in seismoacoustic event processing using arrivals from repeating explosions

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Fransiska Dannemann Dugick<sup>1</sup>, Clinton Koch<sup>1</sup>, Nora Wynn<sup>1,2</sup> and Josh Carmichael<sup>3</sup>

<sup>1</sup>Sandia National Laboratories

<sup>2</sup>Colorado College

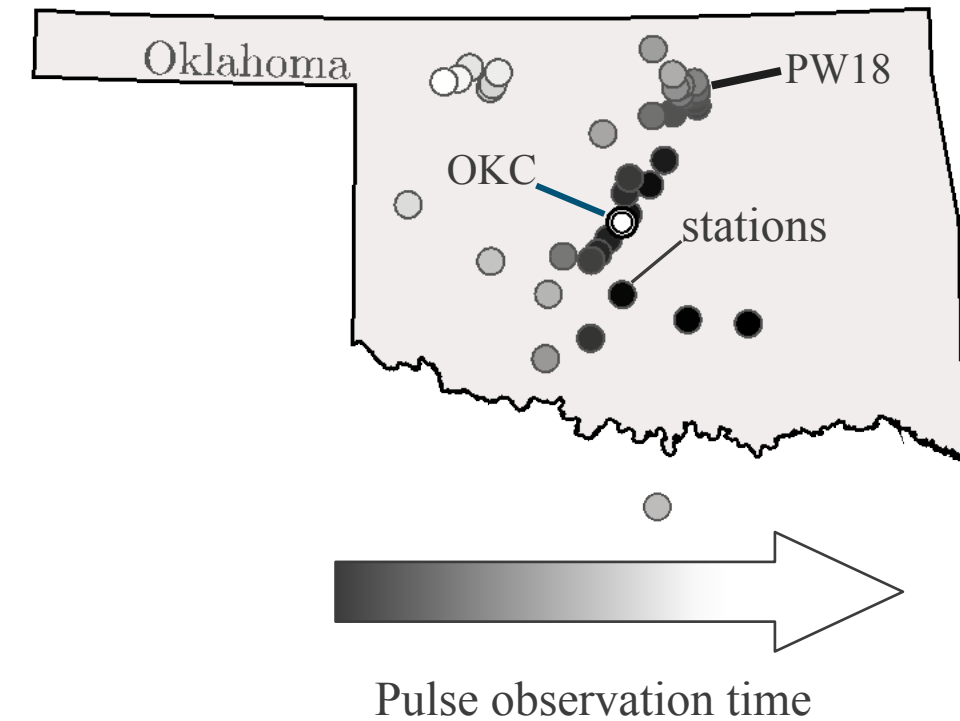
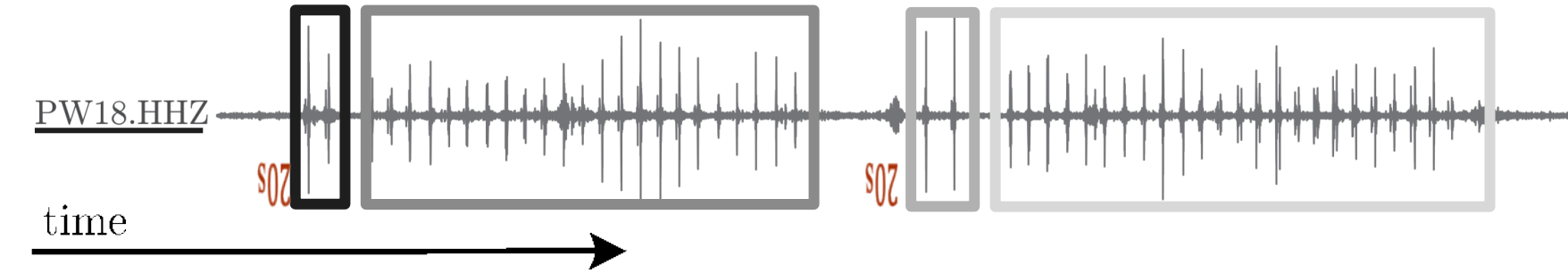
<sup>3</sup>Los Alamos National Laboratory



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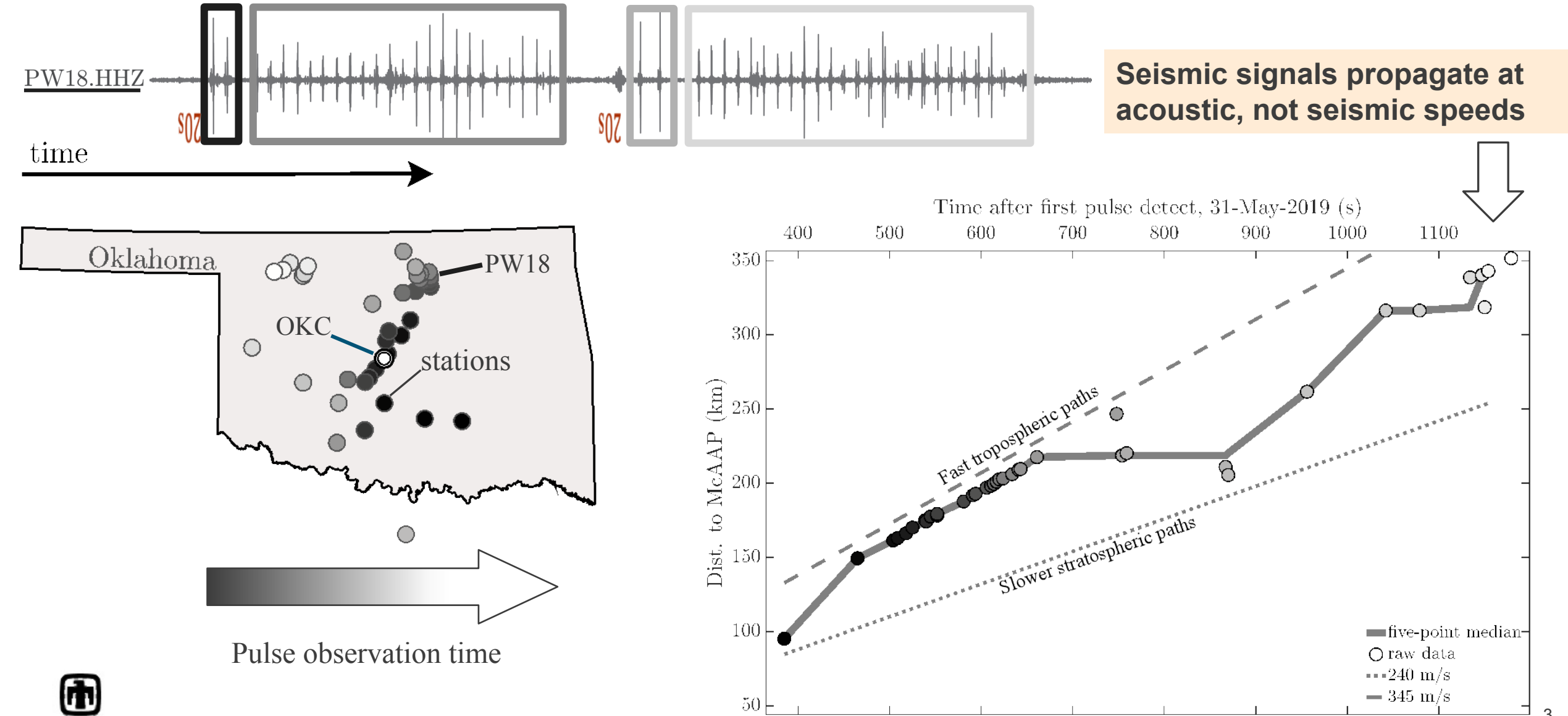
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# Seismo-Acoustic Networks Deployed within OK State Record and Initially Cannot Identify Repeating Pulses



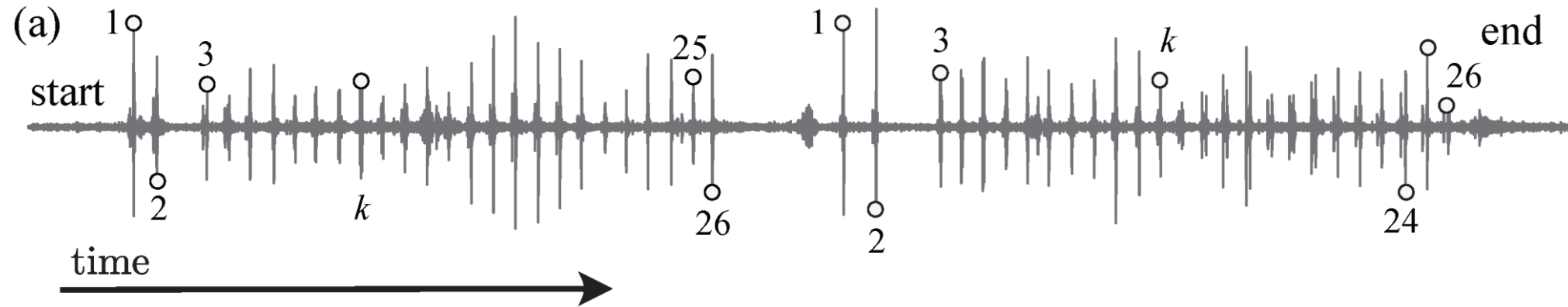
**Background:** Over the summer of 2019, Oklahoma seismic networks recorded sequences of  $\leq 52$  regularly-timed pulses that travelled at acoustic wave speeds. Location of detecting stations, waveform moveout, and signal strength each varied with time. The few available infrasound records showed weak signals

# Seismo-Acoustic Networks Deployed within OK State Record and Initially Cannot Identify Repeating Pulses



# McAlester Army Ammunition Plant Hosts Repetitive, Seismo-Acoustic Sources from Munition Disposal (1/2)

(a) Vertical channel seismic observations

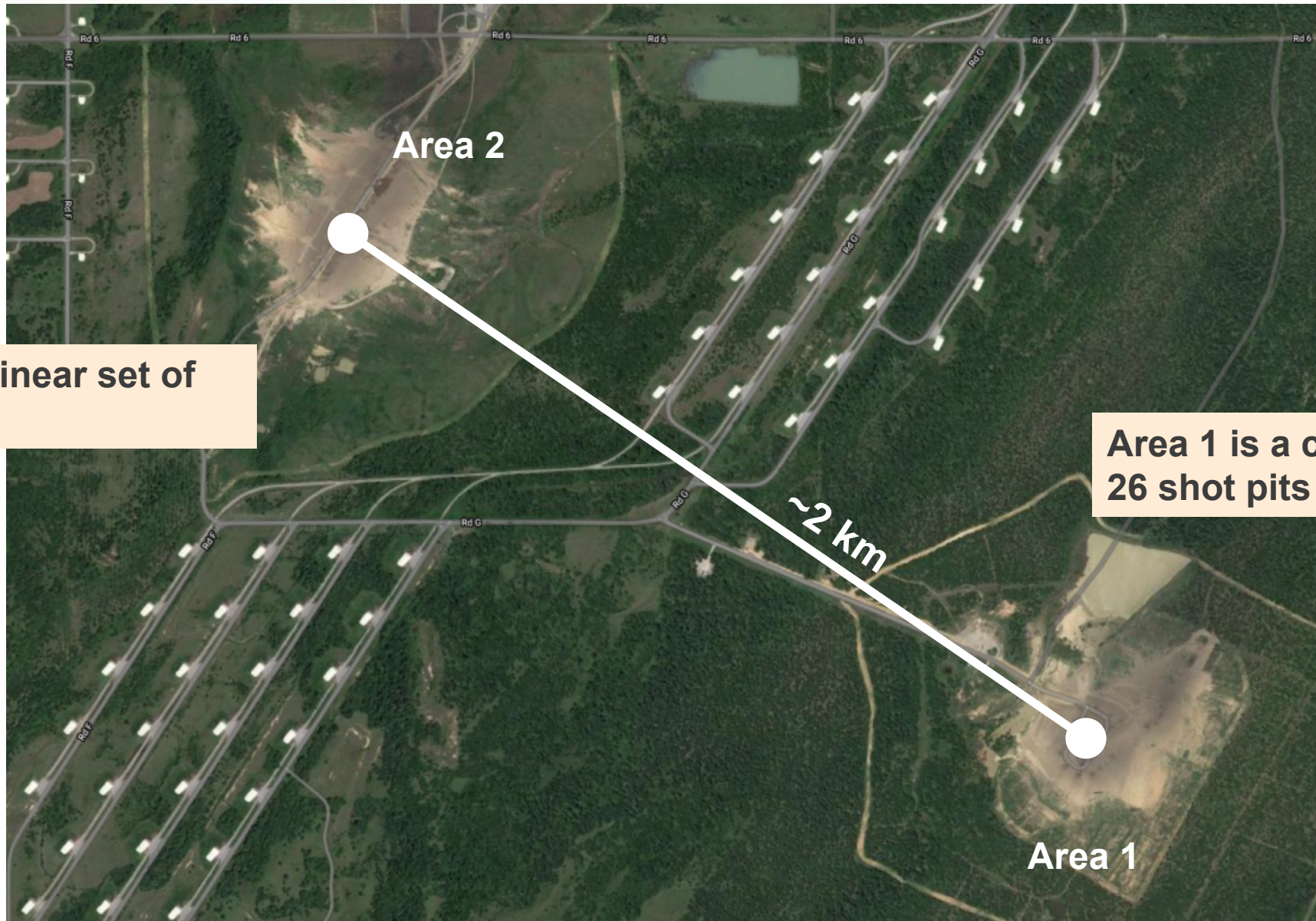


(b) Pulse sequence waveform source locations





# McAlester Army Ammunition Plant Hosts Repetitive, Seismo-Acoustic Sources from Munition Disposal (2/2)

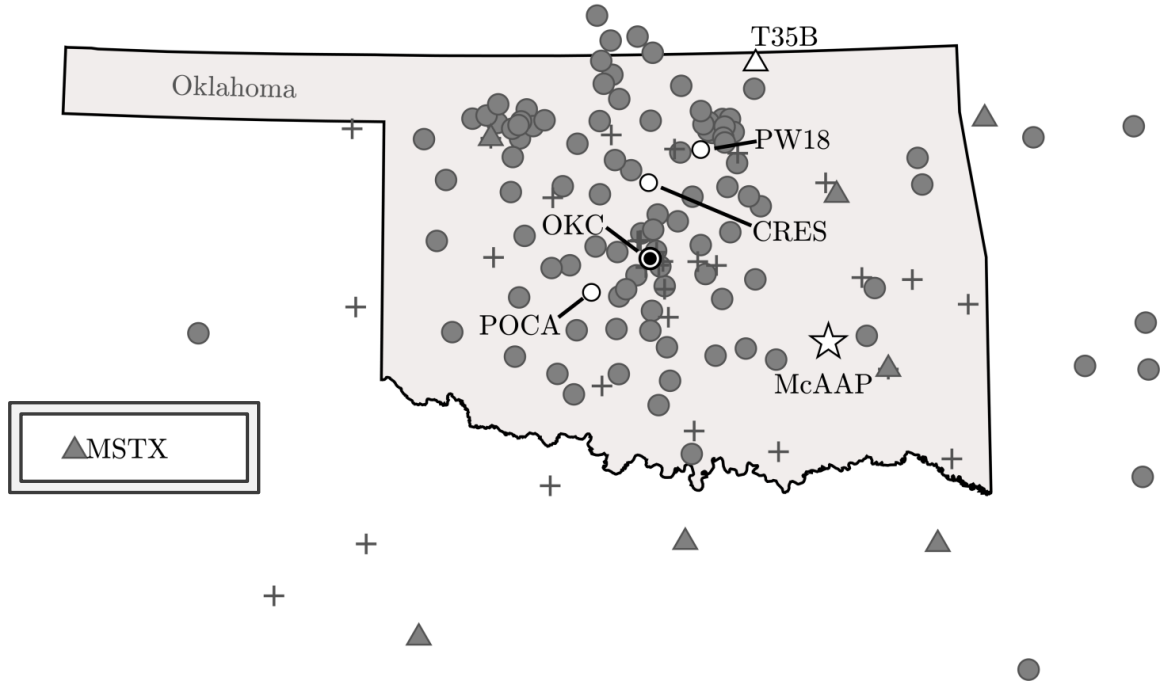


Area 2 is a linear set of 26 shot pits

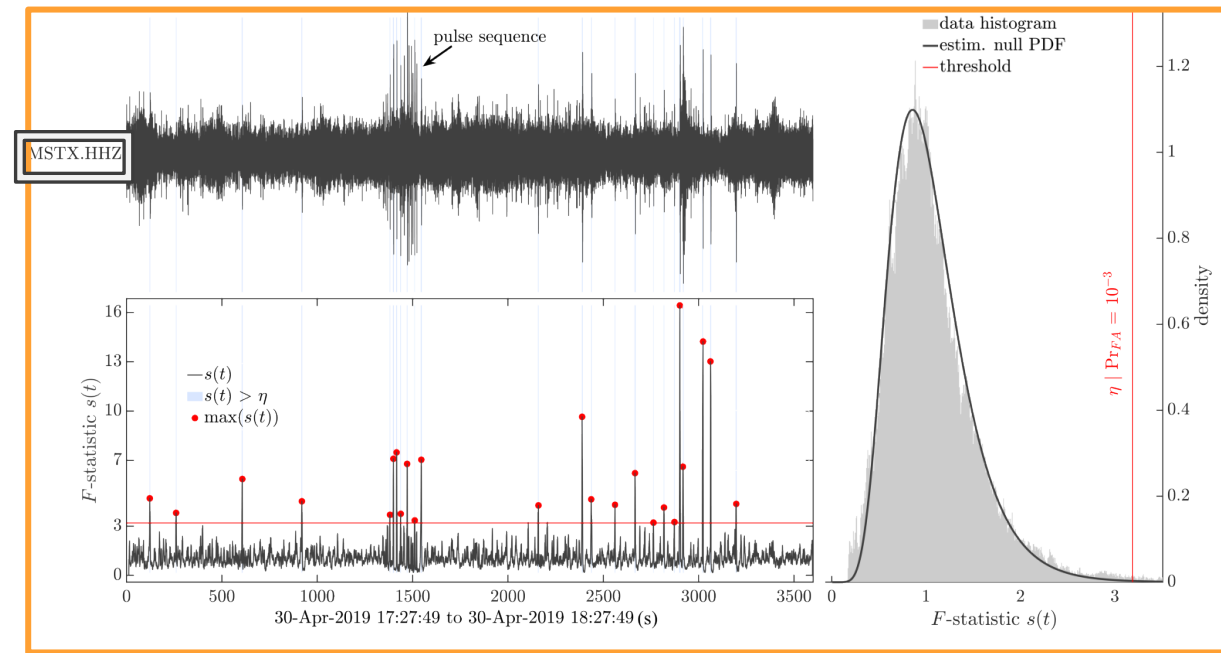
Area 1 is a circular set of 26 shot pits



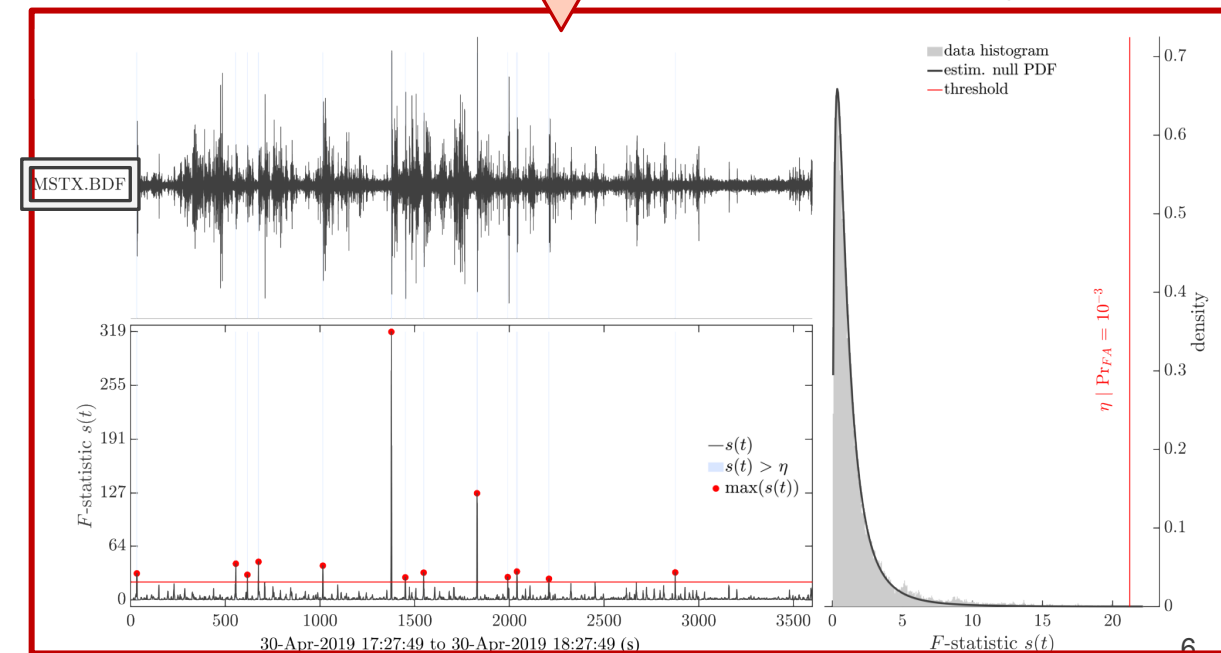
# Seismometers Record Pulse Sequences out to 640km



- **U.S. Army provided blast logs as ground truth for  $\geq 9$  months.** Logs reveal McAAP blasted on **169 of 276** days to destroy **4.3kT** of mass with **7222** shots ( $\sim 600$  kg/shot)
- Includes **10** infrasound co-deployments, but no arrays
- Vertical channel seismic waveform detections output better pulse identification rate than infrasound

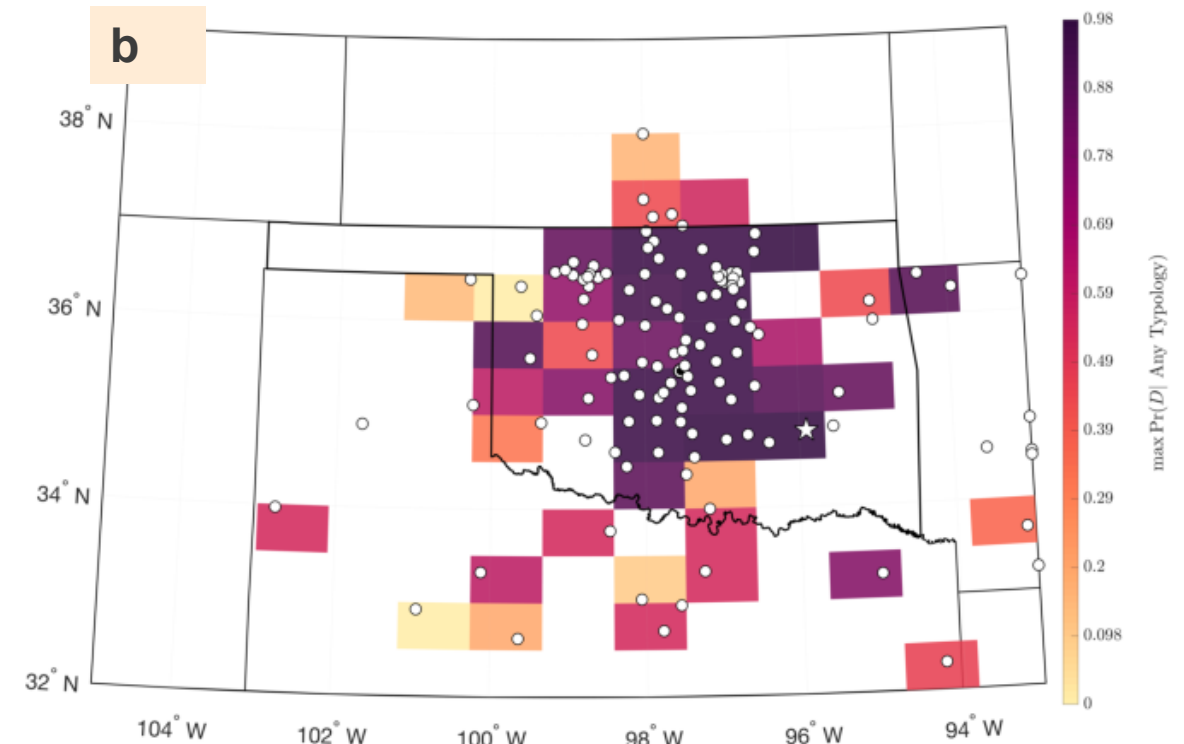
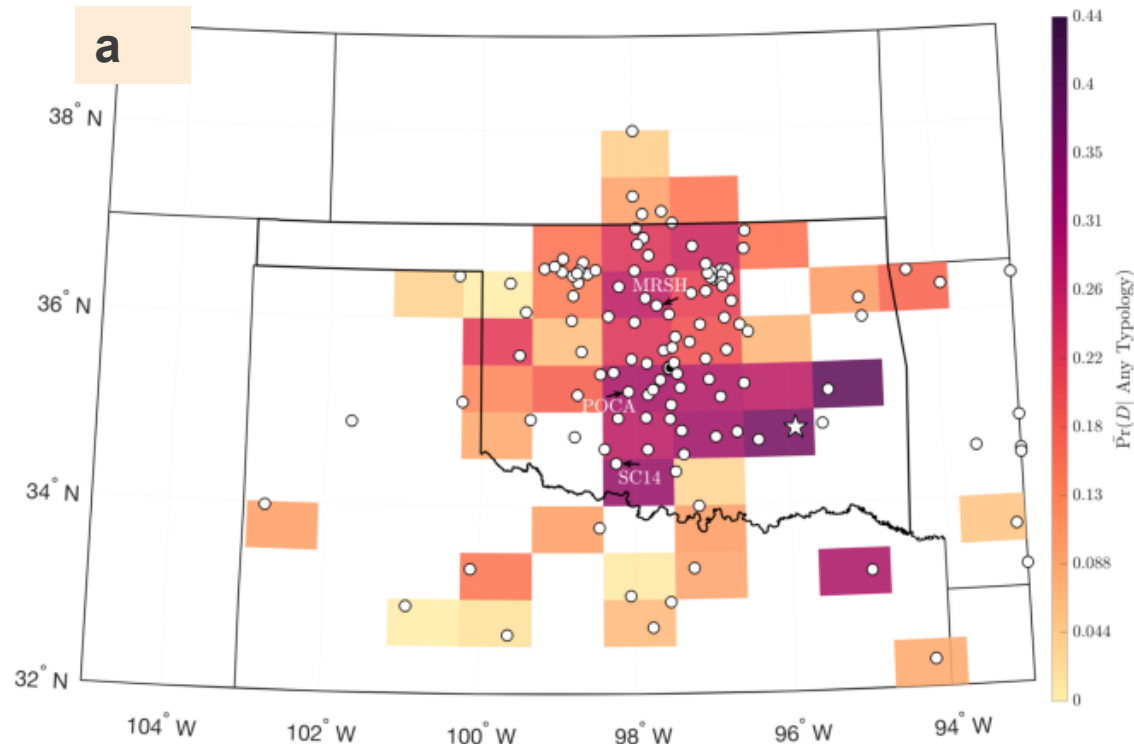


Seismic and Infrasound data, 640 km away



# Manual and Digital Pulse Detections Reveal Variable Seismic Detectability Near Dense Populations

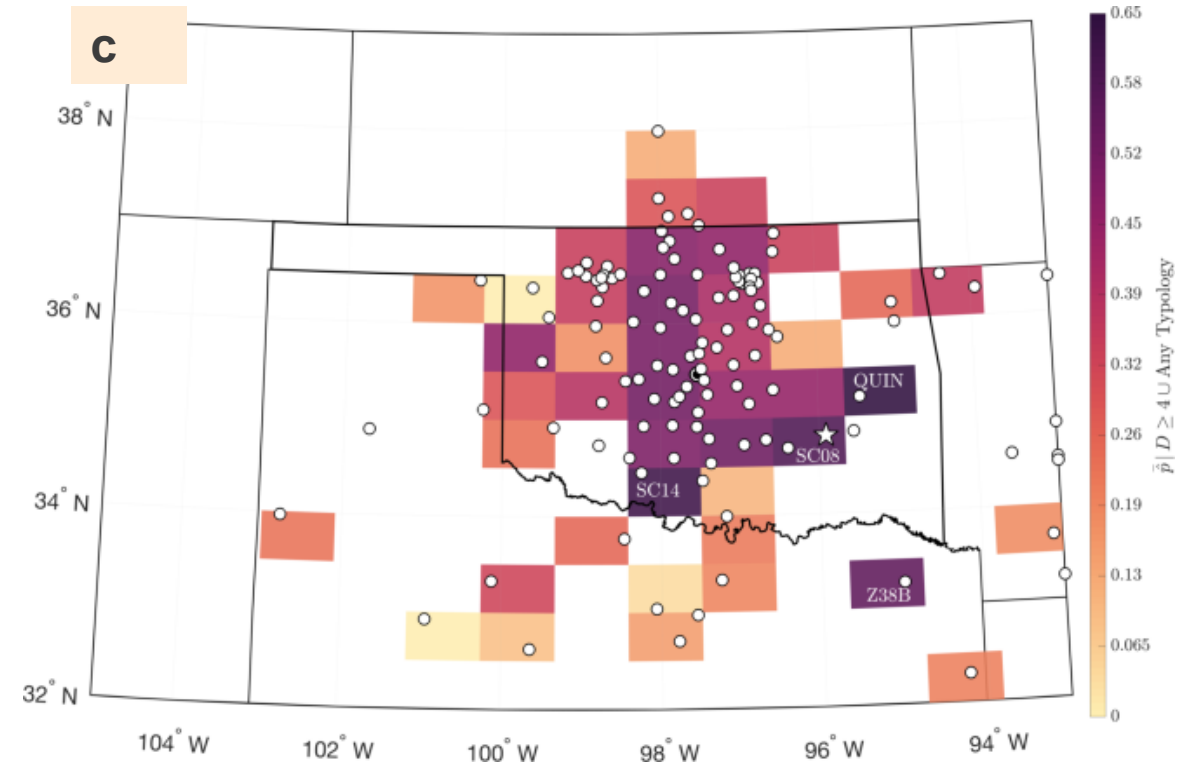
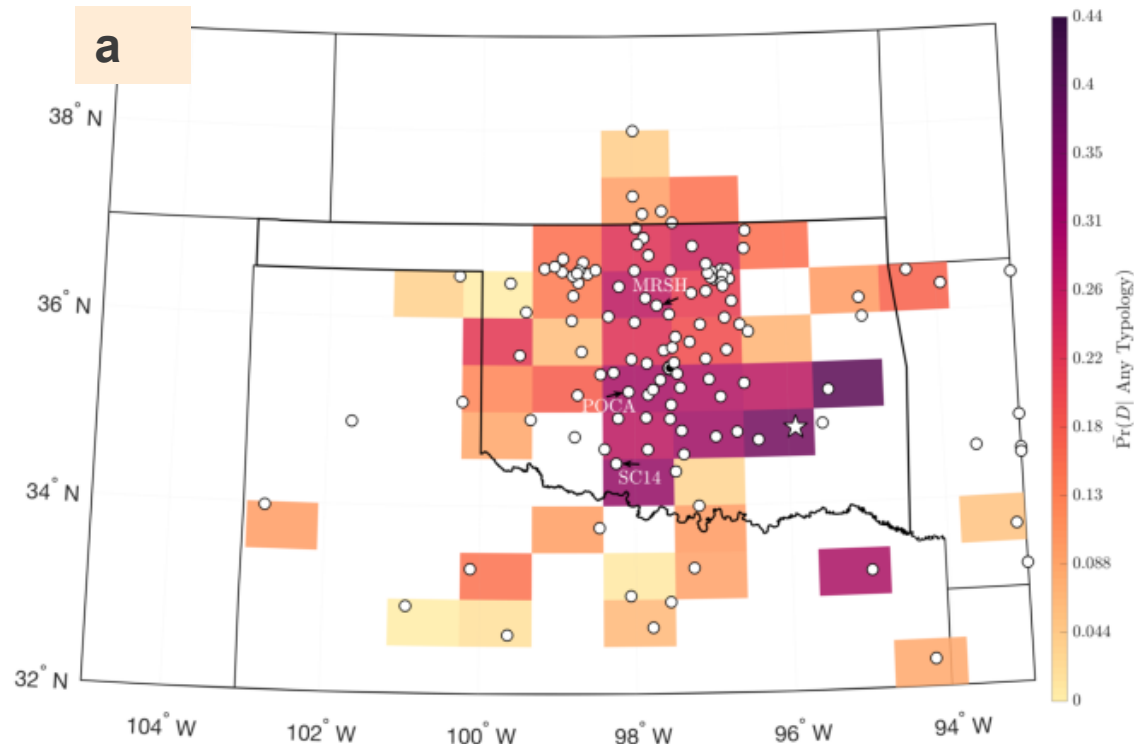
- **Result 1:** Social media witnesses correctly identified blasts on days, at times of blasting, when visual review did not.
- **Result 2:** Visual waveform review was more successful than digital pulse detection, on average (a)
- **Result 3:** Probability of digitally detecting pulse sequence once per sensor, however, is generally high (b)





# Manual and Digital Pulse Detections Reveal Variable Seismic Detectability Near Dense Populations

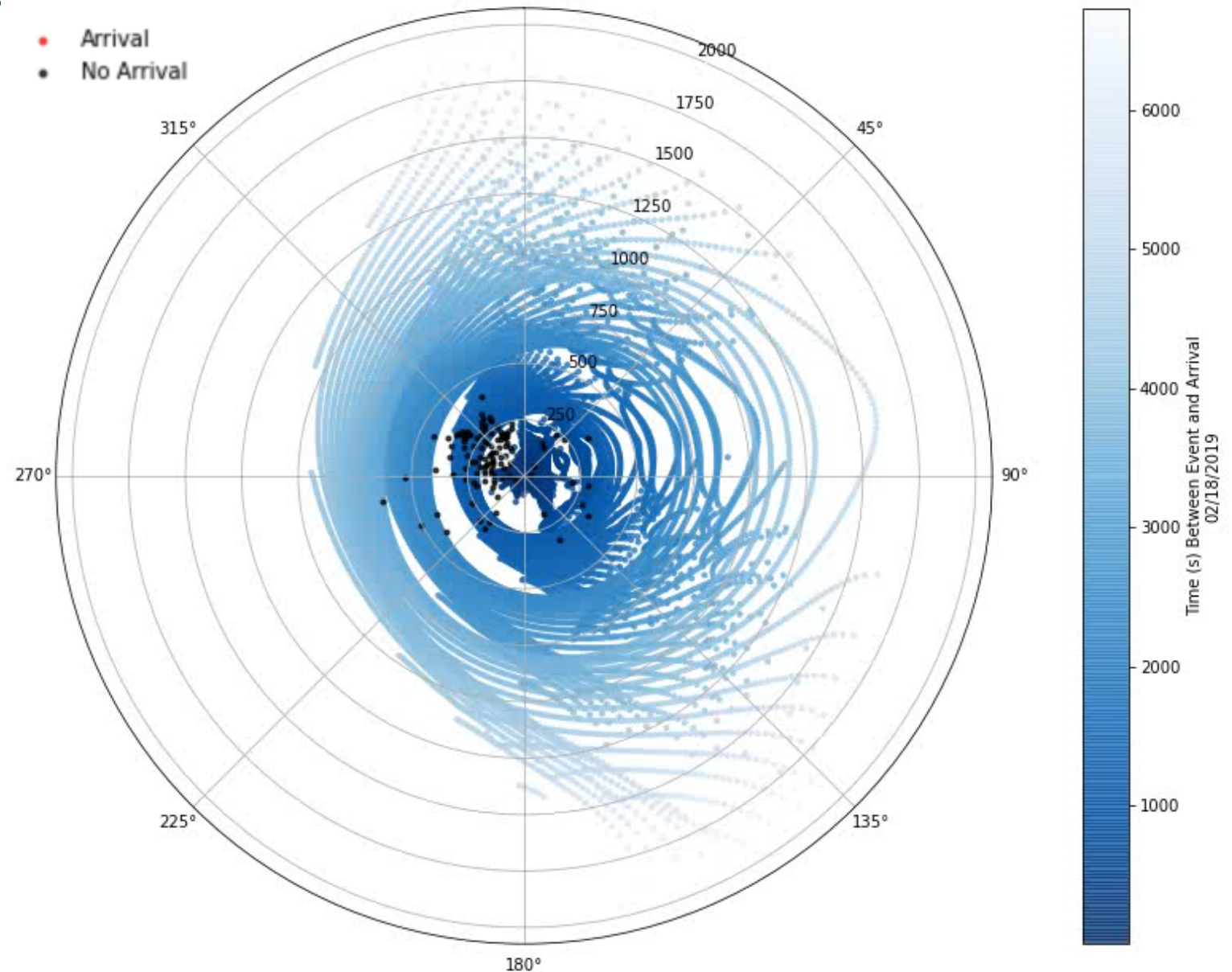
- **Result 2:** Visual waveform review was more successful than digital pulse detection, on average (a)
- **Result 3:** Probability of digitally detecting pulse sequence once per sensor, however, is generally high (b)
- **Result 4:** Probability of digitally detecting any single pulse *within* a sequence remains moderate over state. Sensors ~200km from McAAP have  $\geq 1/2$  probability of digitally detecting pulses, on average (c)







# Propagation Modeling Results Illustrate Discrepancies Between Observed and Predicted Acoustic Arrivals Across the Seismic Network

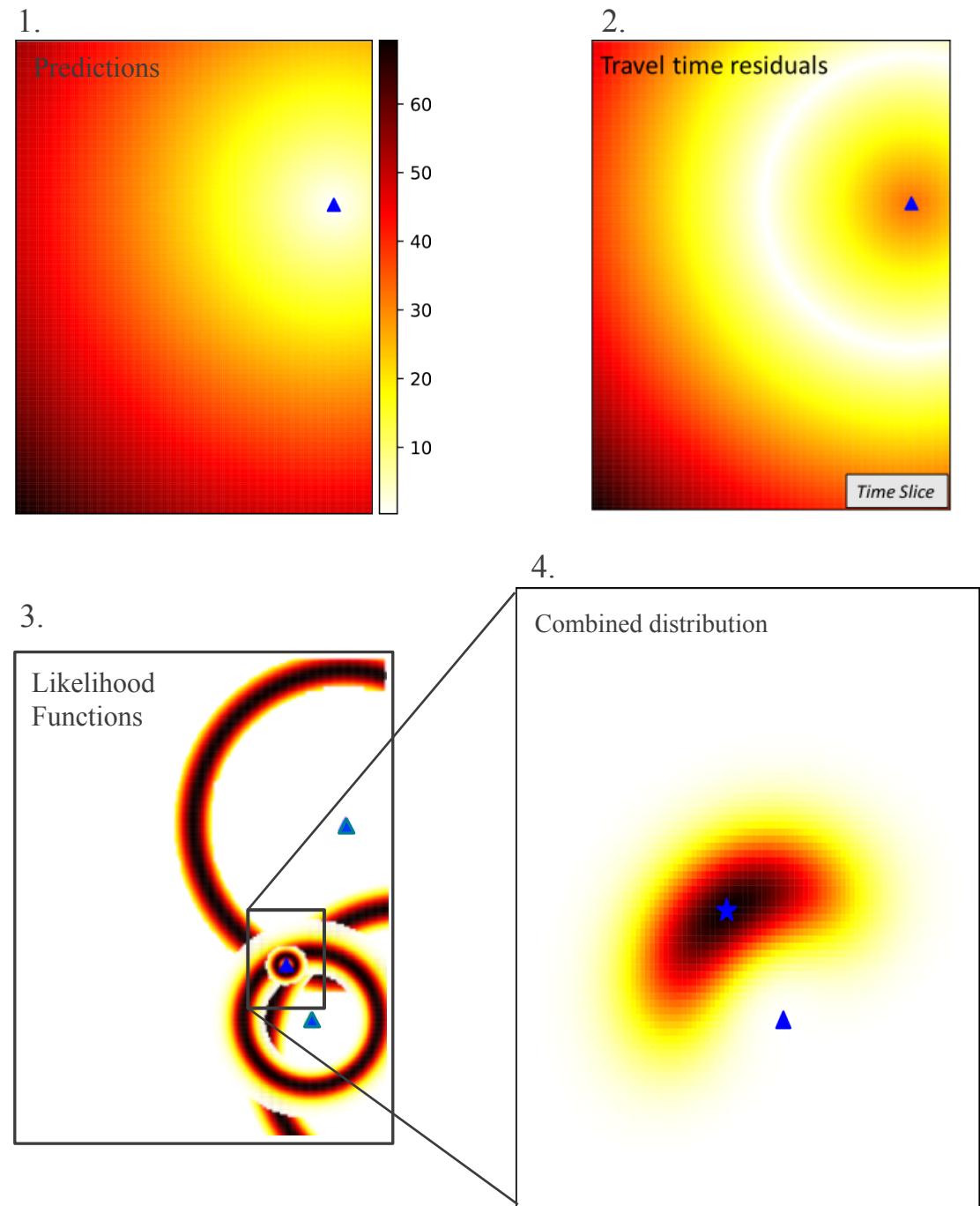


# Producing Seismoacoustic Event Location Estimates

Using probabilistic location method from Koch and Arrowsmith (2019)

Grid search method

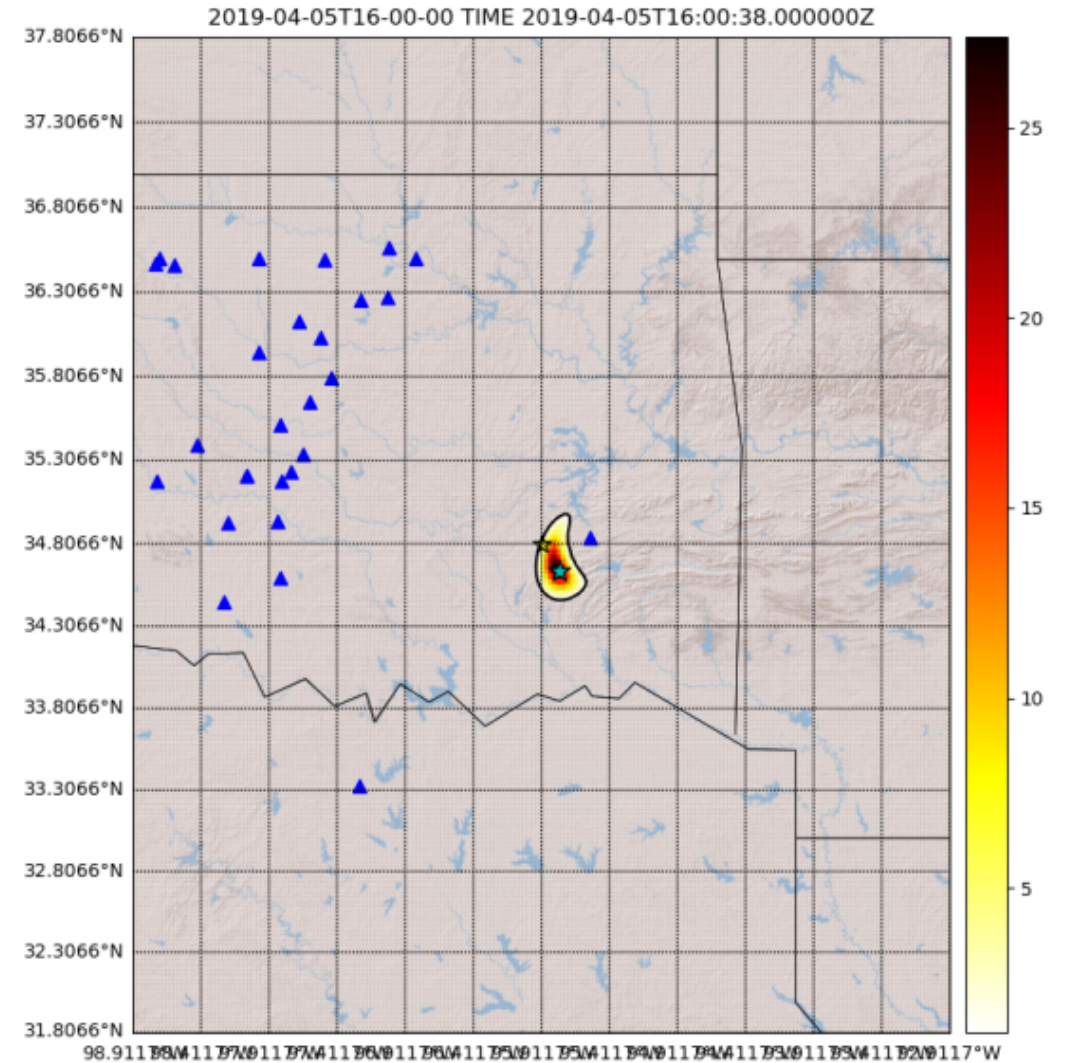
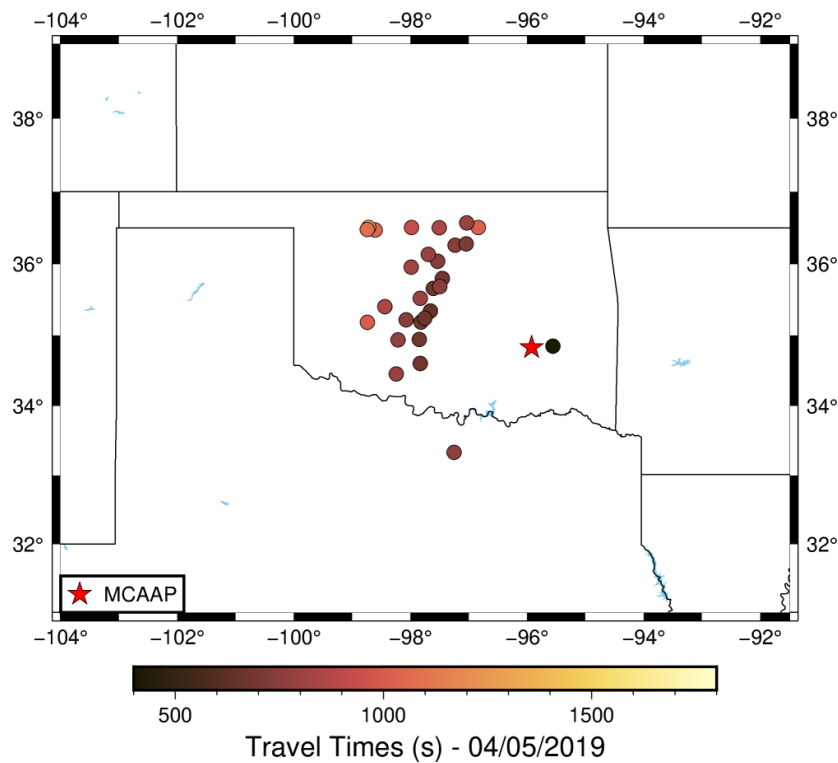
1. Predicts observations
2. Calculates Residuals
3. Calculates individual likelihoods functions
  - Assumes Gaussian Distribution
  - Model and pick uncertainties control the width
4. Combines likelihoods into single distribution
5. Assumes event is at 0 depth



# Event Location Estimates Using Analyst-Derived Arrival Times Indicate Spatiotemporal Variability in Arrivals May Bias

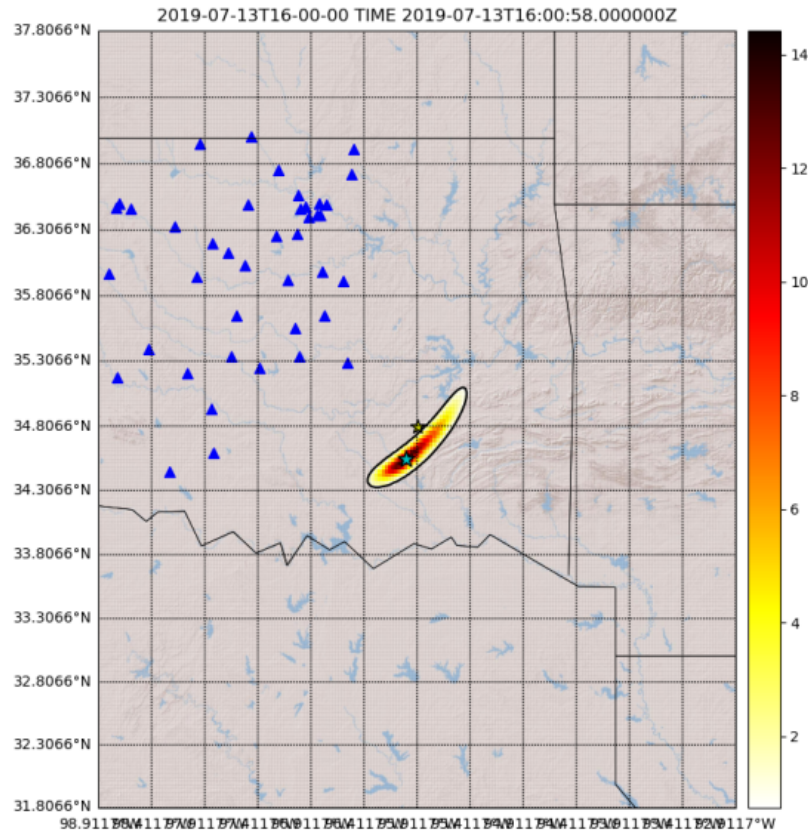
## Location Results

4/5/2019 – Event location estimate is driven by station to the east of MCAAP





# Initial Location Results Suggest that Mis-Associated Arrivals May Contribute to Location Errors



## 07/13/2019 [left-hand figure]

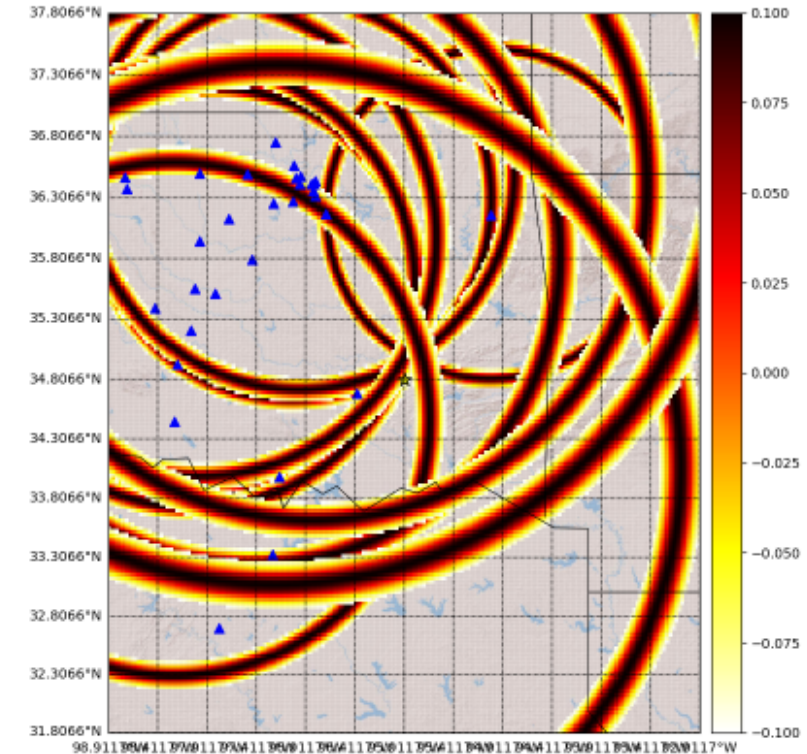
Fixed time was needed to produce a location

Demonstrates one issue of having all stations in one direction, you get smearing effect of the error.

## 04/25/2019 [right-hand figure]

Doesn't find a solution

Some arrivals converge pretty well around the center, but some are quite far off – leading to no unique



# Conclusions + Future Work Plans

- We have compiled a dataset of both observed and predicted arrivals from McAAP blasts over a period of nine months
- Manual analyst identification demonstrates that stations within a range near 200km from the source more consistently record arrivals. This is consistent with arrivals propagating through a stratospheric duct.
  - Data is currently not consistent enough across the nine month period to complete a full review of celerities and arrival times
- There is significant discrepancy between observed and predicted arrivals, indicating that current propagation modeling efforts do not fully capture atmospheric dynamics in this region
  - Less than 50% consistency between location of actual arrivals and predicted arrivals within a radius of 10 km
- Initial location results indicate that acoustic arrivals recorded on seismic stations can be used to produce event locations following the methodology of Koch and Arrowsmith (2019); location accuracy may be driven by detecting station distribution

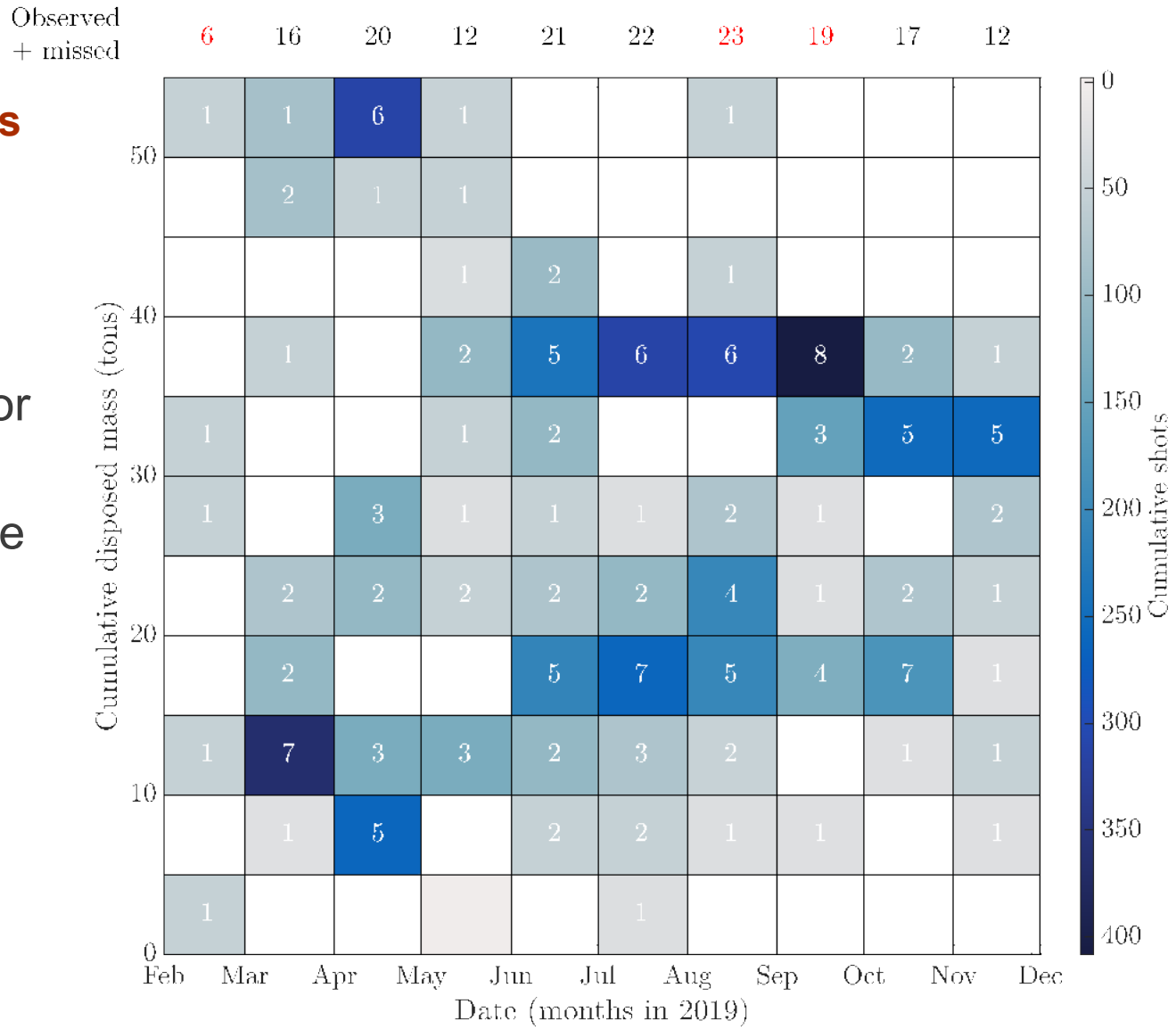


# Data Products: Available to Geophysical Community

## Digitized blast log data provided by Army partners

- McAAP blasted on **169** of **276** days to destroy **4.3kT** of mass with **7222** shots (~**600** kg/shot)
- Only three days lacked any pulse detections for **4033** visual observations at **120** stations
- Linear shot pit Area 2 showed slight preference for blasting (**53%** shots)
- Dependence of observability does not clearly increase with shot size / mass
- Observability of shots has strongest apparent dependence on season

Detection rate = low resolution calendar



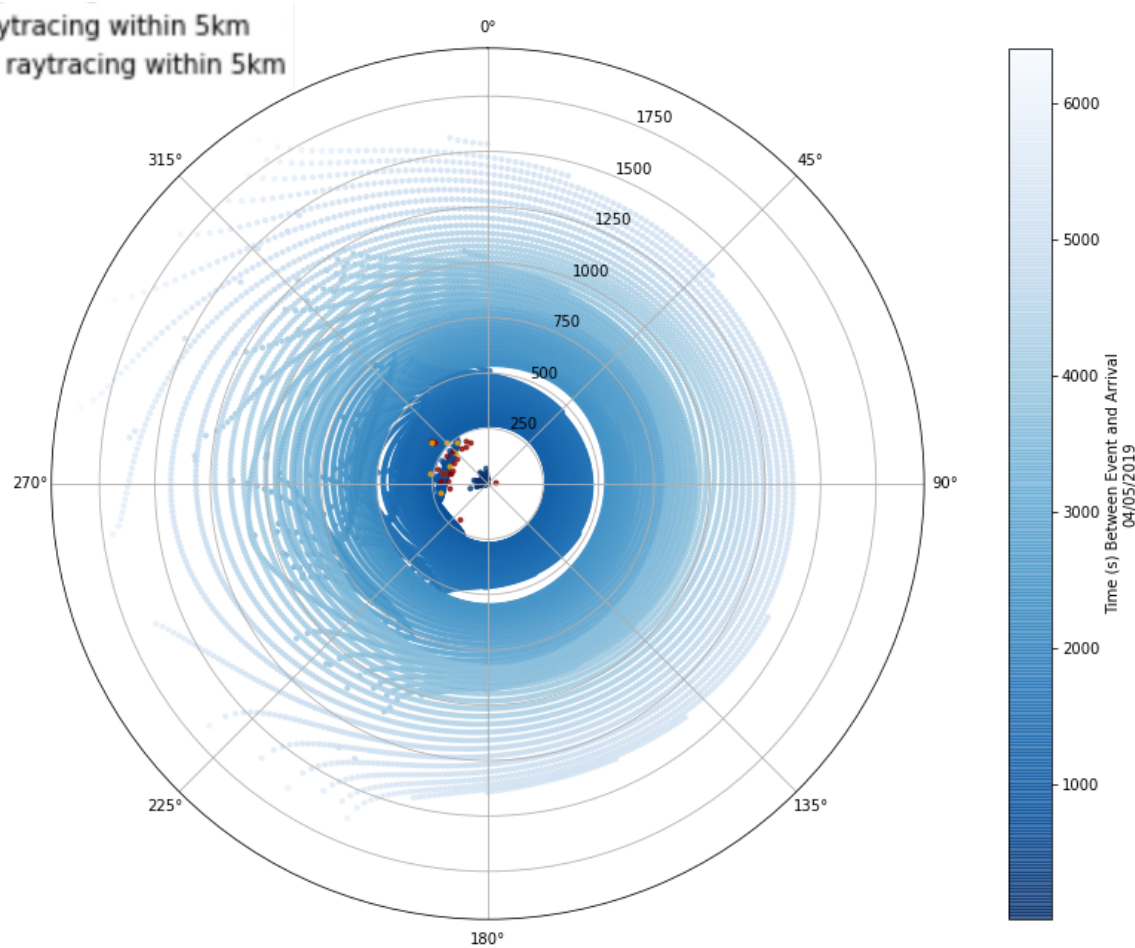


**EXTRA SLIDES  
FOLLOW HERE**

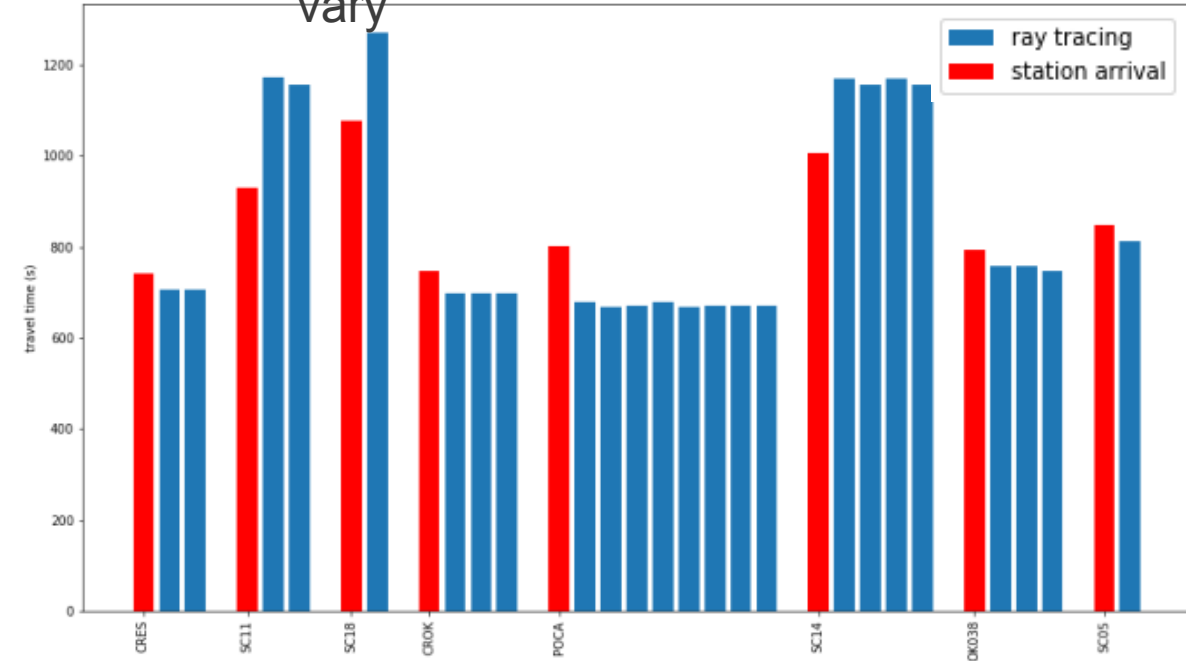




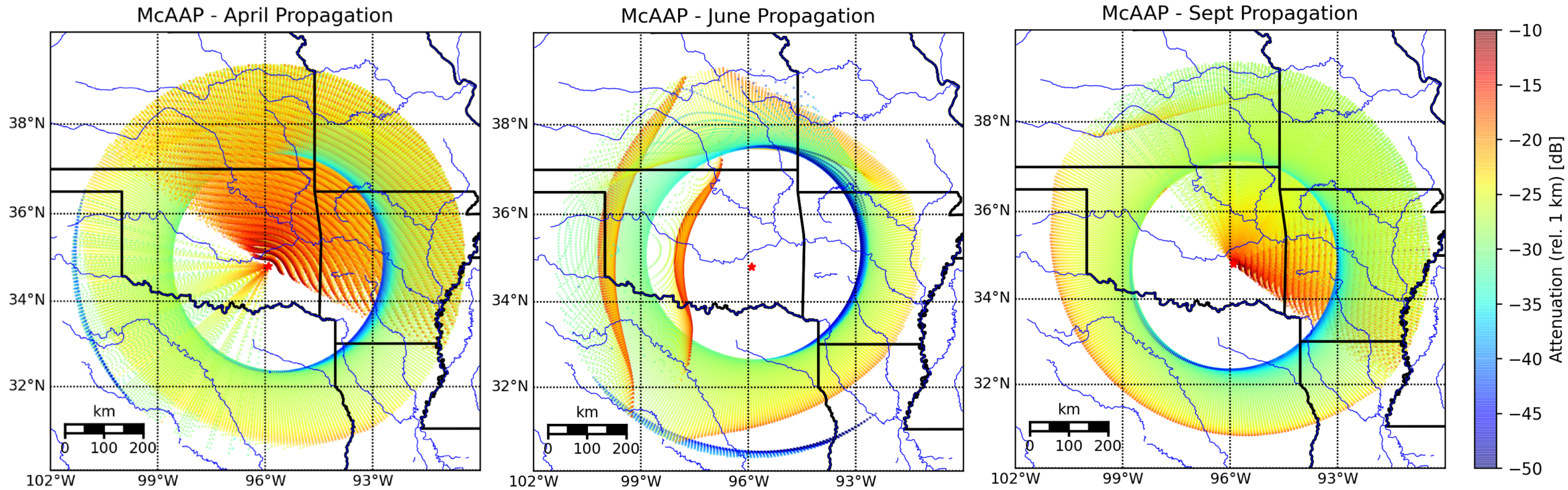
# Initial Travel-Time Comparisons Suggest Additional Discrepancies Between Predicted and Observed Signal Travel Times



29% of arrivals have corresponding ray-tracing predicted arrivals; travel time comparisons document that travel times vary



# Limited modeling with infraGA explains some spatial patterns in detection, that include multi-pathing and shadow zones



- Movie in BSSA publication shows pulse sequences with mass destroyed every day, from March of 2019, through late November