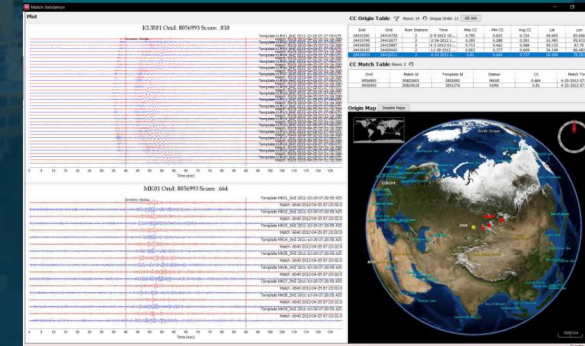
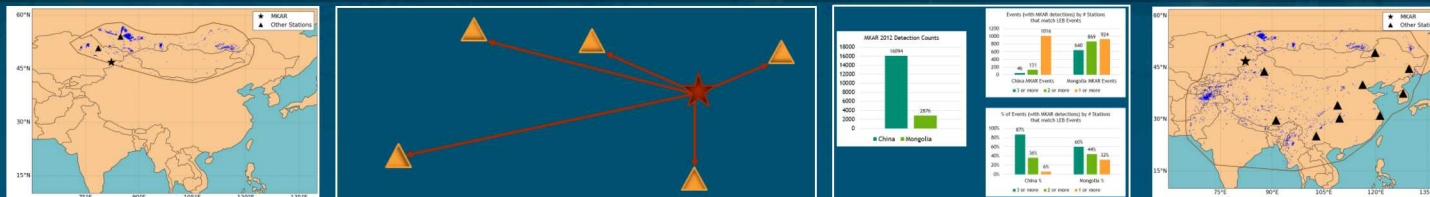


# Waveform Correlation: Two broad area studies in Asia in collaboration with Columbia University



PRESENTED BY

Amy Sundermier<sup>1</sup>

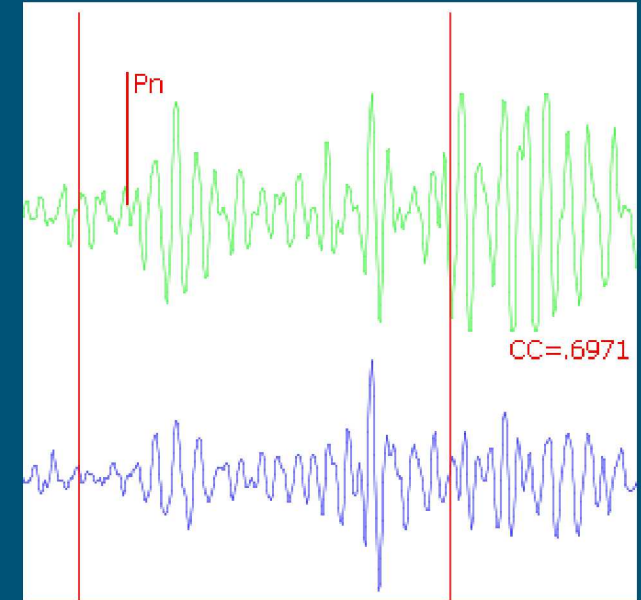
COAUTHORS

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Waveform correlation premise: Use empirical waveform templates to detect repeating seismicity

- Research has demonstrated excellent results for aftershocks and mining activity over small geographic areas
- Investigate application in broad area studies
- Collaboration with Paul Richards and David Schaff of Lamont-Doherty Earth Observatory, Columbia University

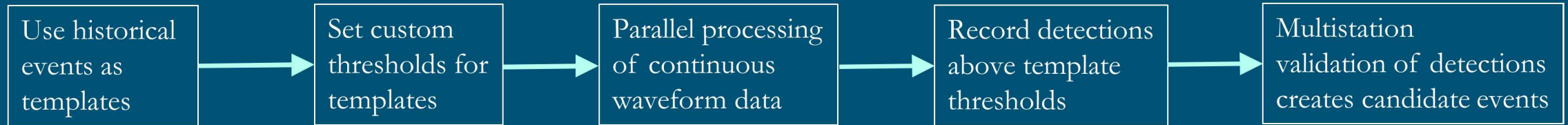


Goal: Produce newly-detected real and well-located events.

- Sandia brings high performance computing for parallel processing of waveforms and non-proliferation and nuclear treaty monitoring.
- Columbia brings expertise with precision relocation using double-difference algorithm.

# Waveform Correlation Approach

Our basic approach to waveform correlation:

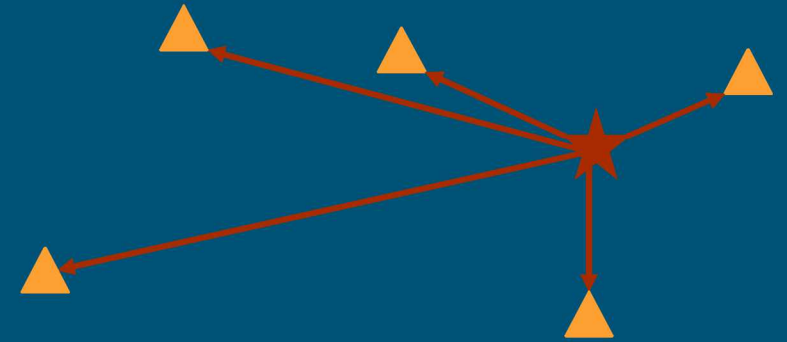


## Study design

- Geographical size of study area (e.g., local, global)
- Topology of network (e.g., choice of stations)
- Duration of template archive
- and so on... many choices

There are two main controls beyond the basic study decisions

- Template cross-correlation thresholds
- Selection of template waveforms

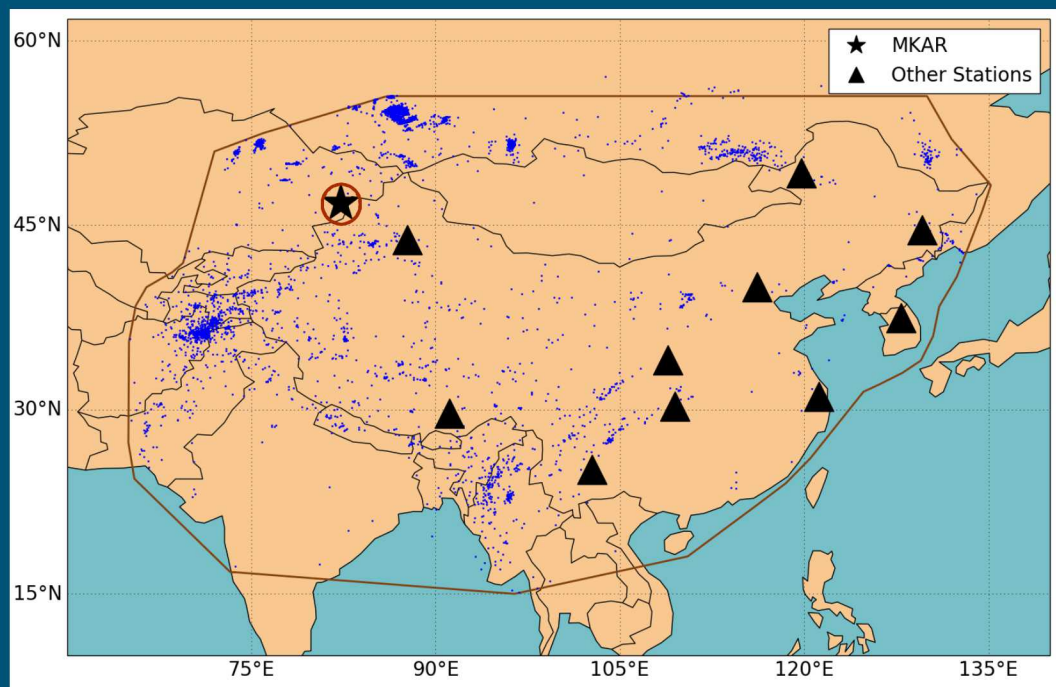




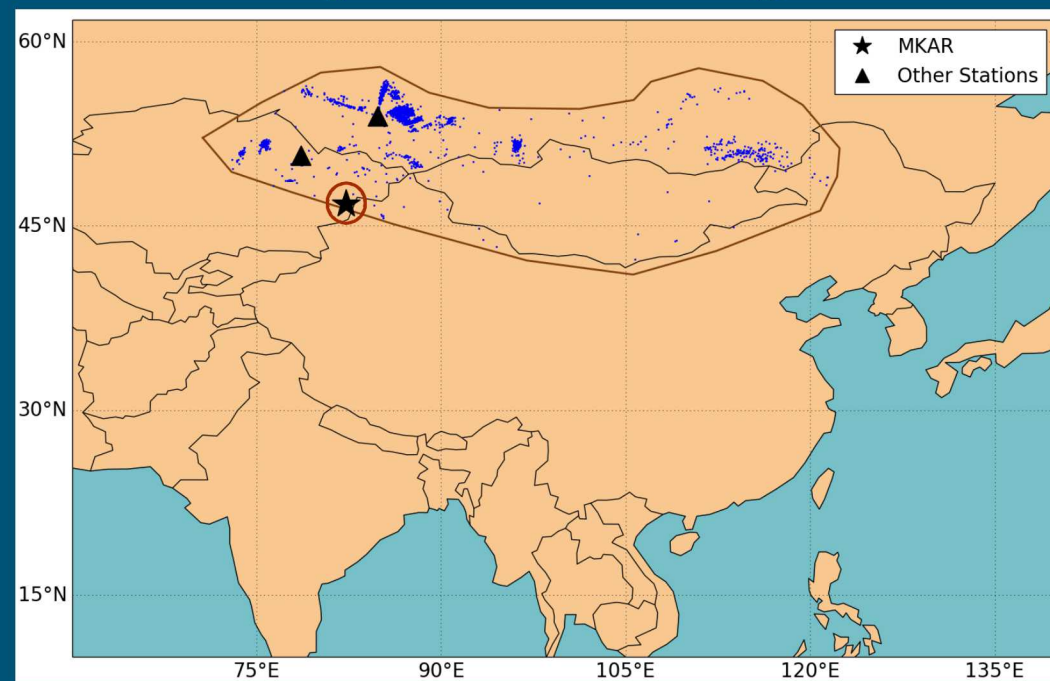
# Makanchi Array (MKAR) in two Asia studies

## Stations and 2012 LEB Events

Eastern Asia centered on China



Mongolia and surrounding area



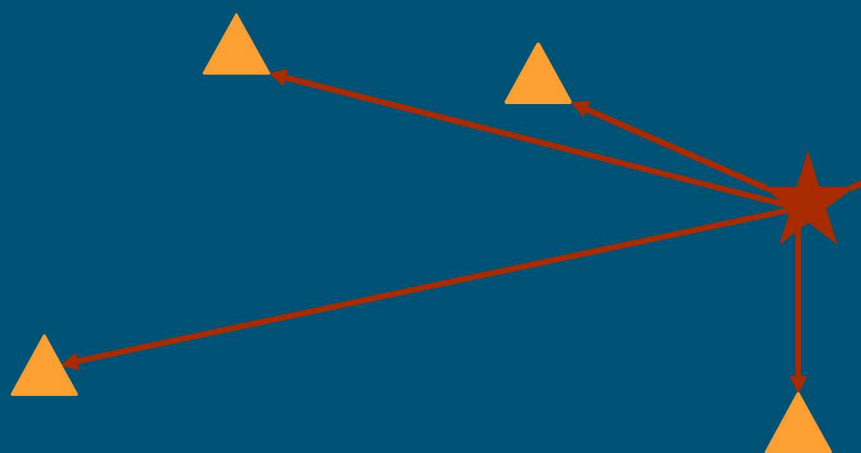
Many single station detections in this study were not validated by multiple stations.

We are experimenting with a network-based approach to template winnowing for this study.

## Network-Based Template Winnowing

Network-based template selection approach for a sparse network:

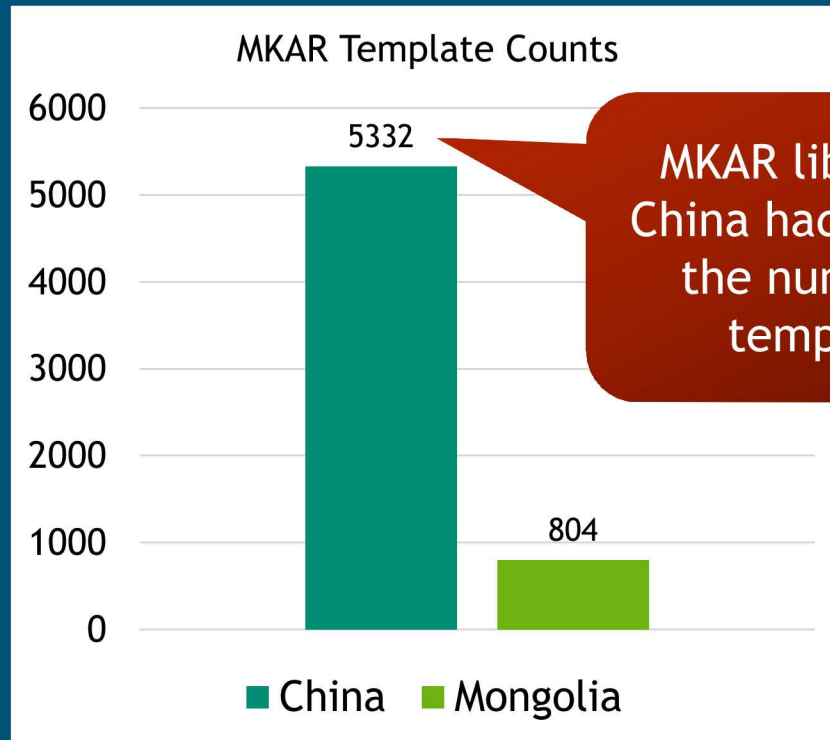
Choose templates from events that were detected by multiple stations in the network, not simply from arrivals seen at a single station



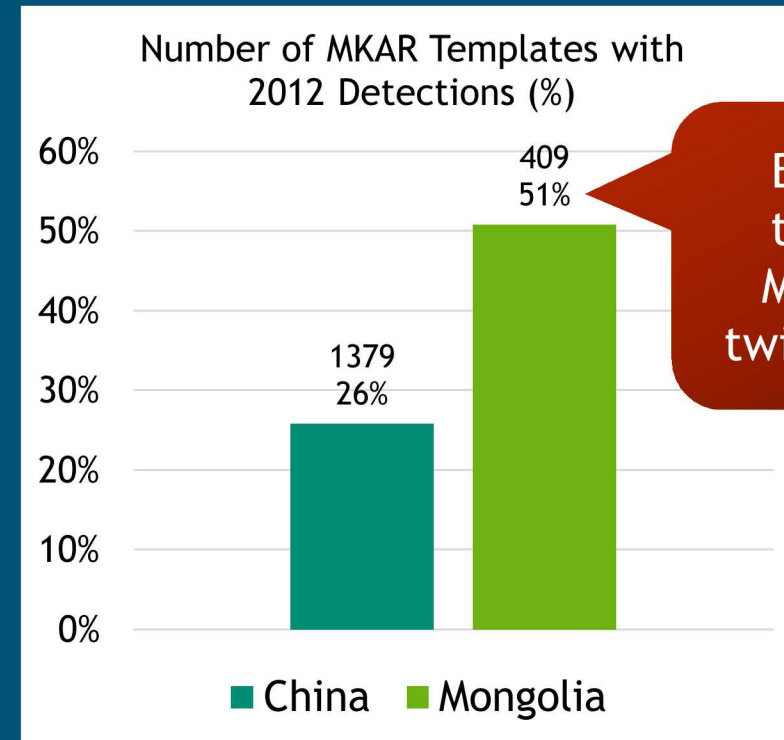
Example: Arrivals are seen by multiple stations in the network for this event. Make candidate waveform templates from these arrivals.

For a sparse network, this may limit templates to waveforms from larger events recorded at large distances, but waveform correlation can lower a detection threshold by one magnitude unit.

## MKAR template library comparison for the two Asia studies



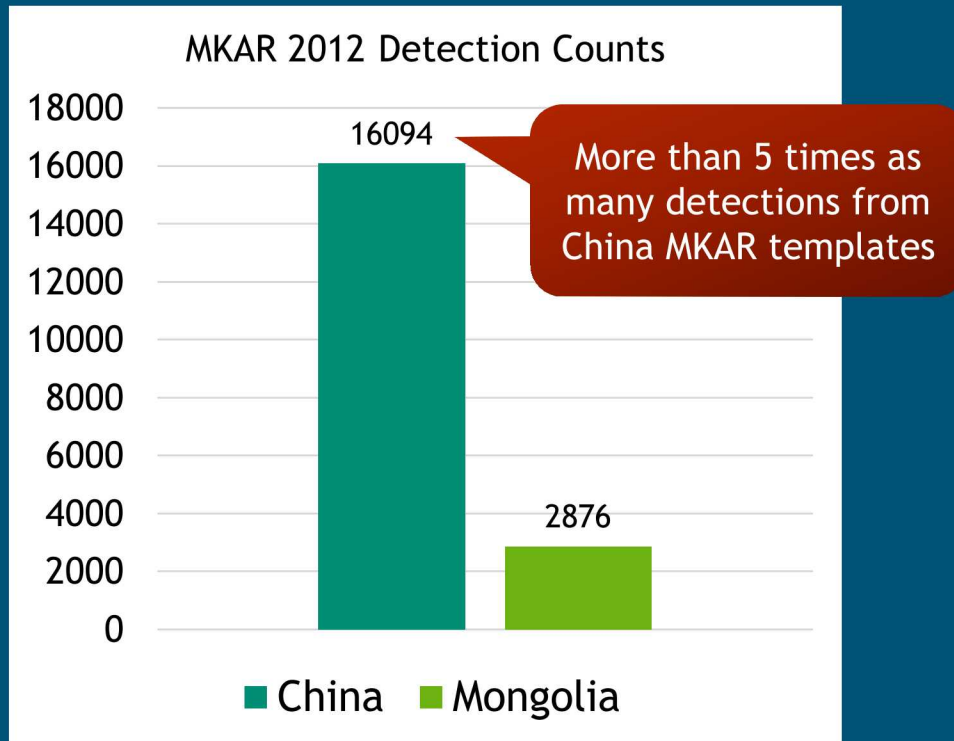
MKAR library for China had >6 times the number of templates



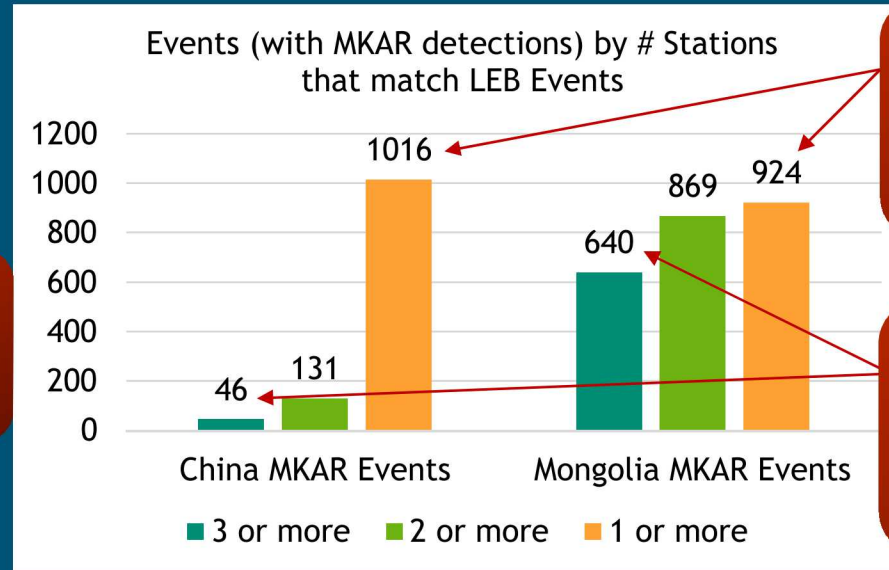
But the MKAR templates for Mongolia were twice as effective

Template quality is crucial.

# MKAR Detection Comparison with LEB for the two Asia studies

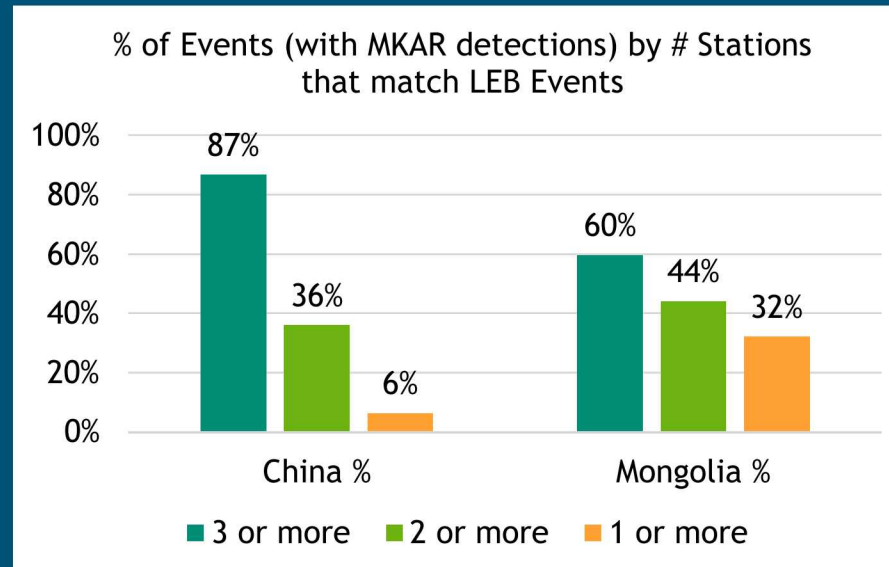


More detections does not guarantee correct or useful event formation.



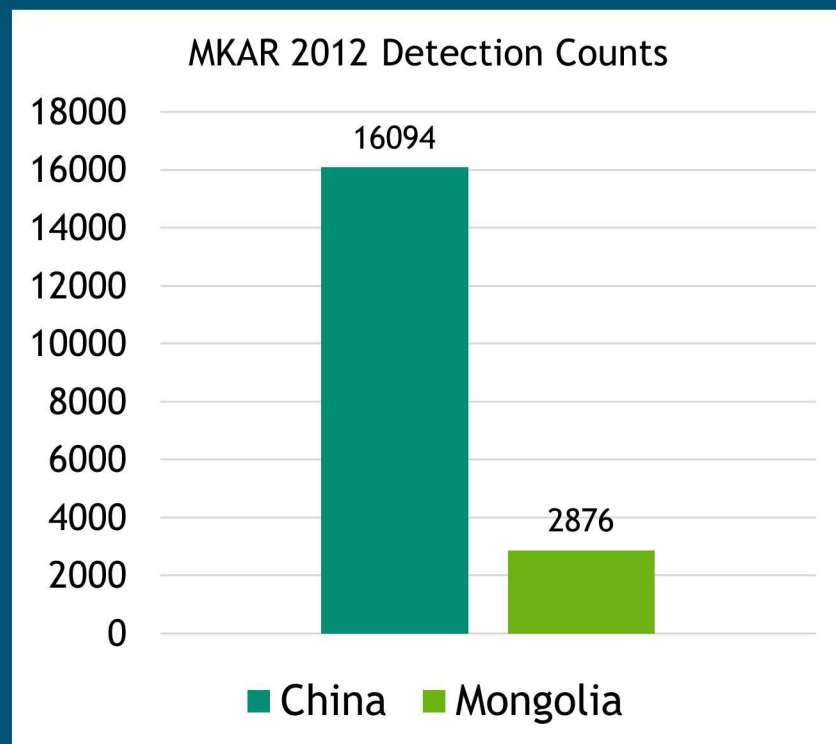
Correlation events with MKAR detections matched LEB events in both studies; MKAR performed well alone.

But there were almost 14 times more 3 station events with Mongolia MKAR templates; network performed well.

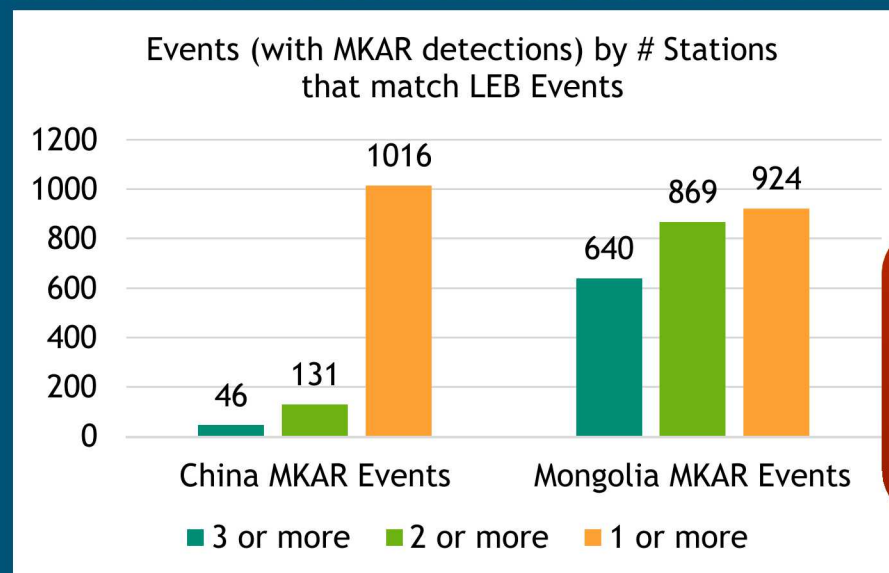




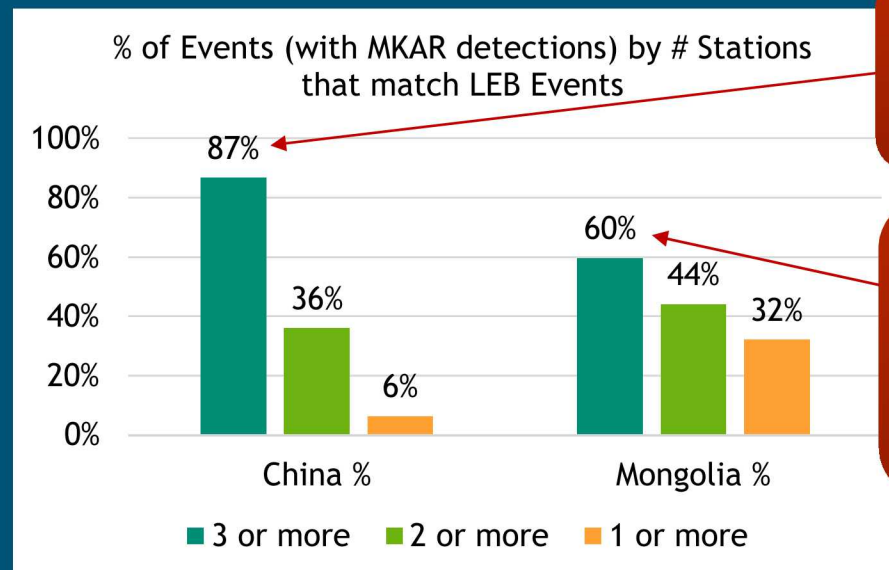
# MKAR Detection Comparison with LEB for the two Asia studies



More detections does not guarantee correct or useful event formation.



We want a balance of matches to catalog events for validation, but also new events from waveform correlation.

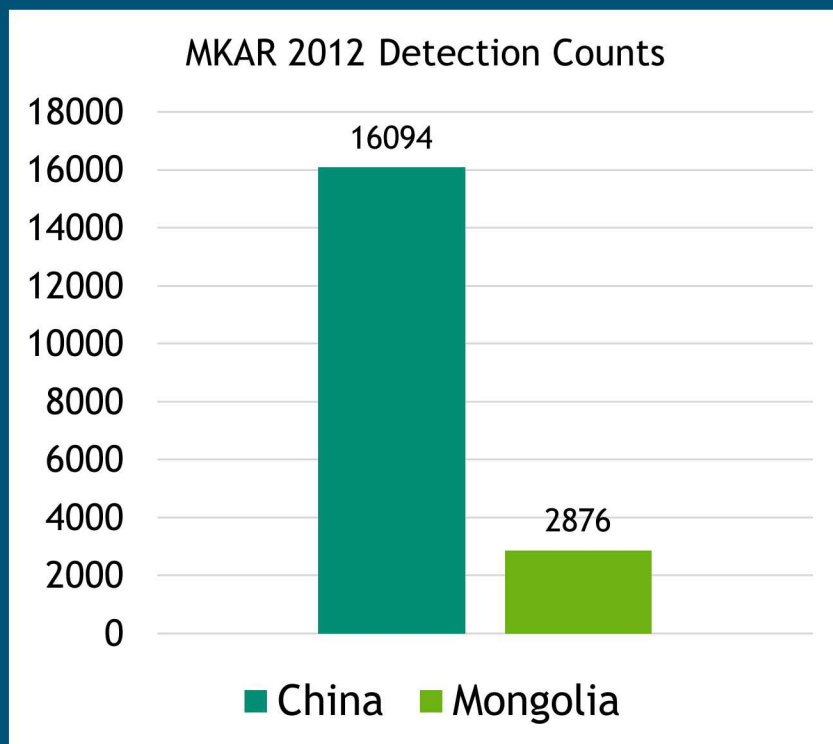


3 station events in China study matched LEB well, but few additional 3 station events created.

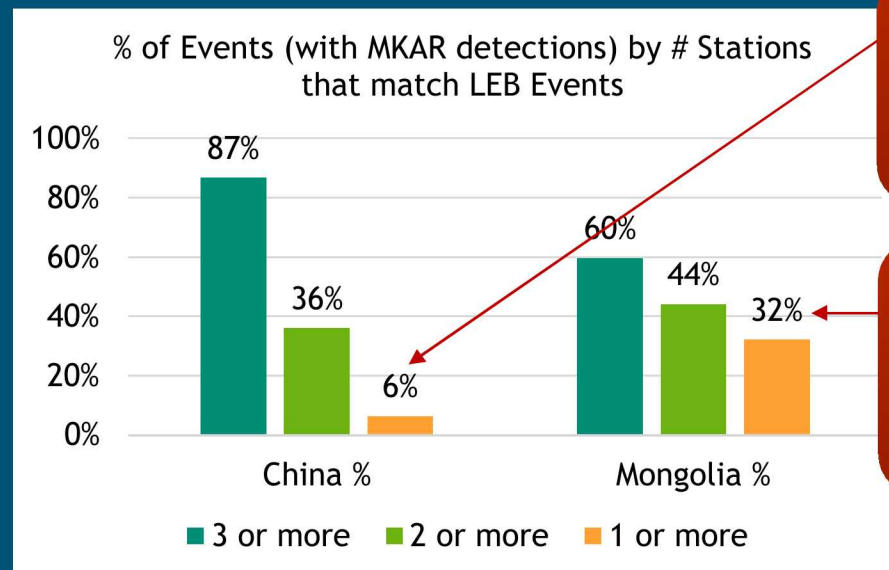
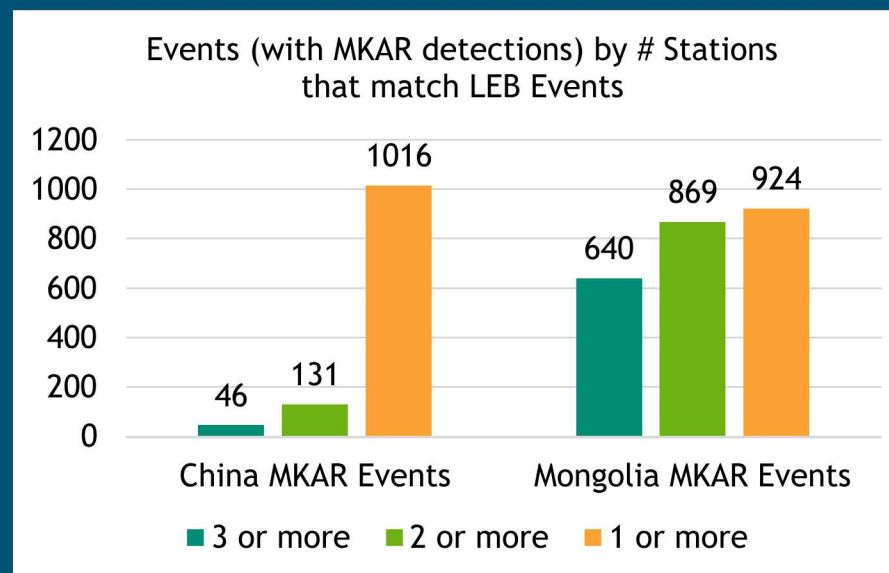
60% of 3 station events in Mongolia matched LEB, so 40% are new events that we have confidence in.



# MKAR Detection Comparison with LEB for the two Asia studies



More detections does not guarantee correct or useful event formation.



Only 6% of MKAR single station events in China matched LEB events - are these good detections?

With >30% matches to LEB events, we have more confidence in MKAR single station events in Mongolia.

The Eastern Asia study is complete.

- Substantial processing time.
  - 12 stations (3 arrays, 9 3-C) for 1 year required  $> 600$  hours correlation time on computing cluster
  - Many single station detections were not validated by other stations.

The Mongolia study is on-going.

- Fewer templates reduced processing time
  - 4 arrays for 5 years required less than 200 hours correlation time

A network-based winnowing of candidate arrivals will:

- Retain high-quality template waveforms for network-detected historical events
- Reduce the number of template waveforms and corresponding processing time
- Produce detections that associate to multi-station events

Slinkard, M., S. Heck, D. Schaff, N. Bonal, D. Daily, C. Young, and P. G. Richards (2016). Detection of the Wenchuan Aftershock Sequence Using Waveform Correlation with a Composite Regional Network, *Bull. Seismol. Soc. Am.* **106**, 1371-1379, doi: 10.1785/0120150333.

Slinkard, M., D. Schaff, N. Mikhailova, S. Heck, C. Young, and P. G. Richards (2014). Multistation validation of waveform correlation techniques as applied to broad regional monitoring, *Bull. Seismol. Soc. Am.* **104**, 2768-2781, doi: 10.1785/0120140140.

Slinkard, M., A. Sundermier, S. Heck, J. Perry, C. Young, D. Schaff, and P.G. Richards (2016). Repeated Event Detection in Eastern Asia using Historical Archives, Poster presented at Seismological Society of America (SSA) 2016 Annual Meeting, April 20-22, Reno, Nevada, USA.

Sundermier, A., M. Slinkard, J. Perry, D. Schaff, C. Young, and P. G. Richards (2017). Automated Techniques for Waveform Correlation Applied to Regional Monitoring of Eastern Asia, Poster presented at CTBT: Science and Technology 2017, June 26-30, Vienna, Austria.

Sundermier, A., M. Slinkard, J. Perry, D. P. Schaff, C. Young, and P. G. Richards (2018). Automated Techniques for Waveform Correlation Applied to Regional Monitoring of Eastern Asia. *Technical Report SAND2018-9071* Sandia National Laboratories.