# Clara E. Yoon

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### **EDUCATION**

2012 – 2018 Stanford University, Stanford, CA

Ph.D. Geophysics

Thesis title: A FAST Data Mining Approach for Similar Earthquake Detection

Thesis URL: <a href="https://purl.stanford.edu/nc875km0099">https://purl.stanford.edu/nc875km0099</a>

Advisor: Prof. Gregory Beroza

• 2012 – 2015 Stanford University, Stanford, CA

M.S. Geophysics

• 2002 – 2006 University of California Los Angeles, Los Angeles, CA

B.S. Physics, with minor in Mathematics

### PROFESSIONAL EXPERIENCE

2018 – present Supervisory Geophysicist
 Earthquake Science Center, Pasadena Field Office
 United States Geological Survey (USGS), Pasadena, CA

- Assumed USGS advisory/leadership role for development, maintenance, and operation of realtime earthquake monitoring software in the Southern California Seismic Network (SCSN), in collaboration with Caltech Seismological Laboratory
- Responded to magnitude 6.4 and 7.1 Ridgecrest, California, earthquakes in July 2019 as duty seismologist: reviewed automatic earthquake solutions for accuracy, coordinated with external partner agencies, and conducted interviews with local media
- Led product planning and requirements development for the next-generation Earthquake Notification Service (ENS), a flagship USGS IT product that sends customized real-time email and text earthquake notifications to over 400,000 users
- Tested, maintained, documented, and supported users of a Java software application (Jiggle) used by seismic networks nationwide to refine earthquake phase picks, locations, and magnitudes
- Supported, planned, and coordinated operations of real-time ground shaking intensity (ShakeMap) products for southern California earthquakes
- Introduced and promoted software development best practices: version control, git workflow, coding standards, unit tests, integration tests, issue tracking, code review, documentation

- Managed local USGS IT team: supervised two direct reports, led new hiring effort, and interviewed multiple job candidates
- Collaborated with stakeholders in geographically distributed locations including other USGS offices, academic institutions, and external organizations

# 2012 – 2018 Graduate Student Researcher with Prof. Gregory Beroza *Observational Earthquake Seismology* Department of Geophysics, Stanford University, CA

Performed a diverse range of scientific investigations and fundamental research in observational earthquake seismology and geophysics (see below):

### Data mining algorithms for earthquake detection

- Developed a novel technique to detect earthquakes with similar waveforms in continuous seismic data, based on music recognition technology
- Detected low-magnitude, uncataloged earthquakes on the Calaveras Fault in central California 140 times faster than a reference autocorrelation algorithm
- Presented complex technical information in conference posters, oral presentations, software documentation, and peer-reviewed publications

# Big seismic data analytics: unsupervised large-scale search for similar earthquakes

- Developed, tested, and documented a parallel Python/C++ software application on Linux clusters to detect earthquakes with similar waveforms in decade-long continuous data sets, in collaboration with Stanford Computer Science researchers
- Key contributor to open-source software application for similar earthquake detection: https://github.com/stanford-futuredata/FAST
- Identified and located uncataloged small earthquakes in coastal central California from 2007-2017
- Tested utility of software on additional seismic data sets, with varying network configurations and durations, from Saudi Arabia, Italy, New Zealand, Netherlands, and Tanzania

### Induced seismicity

- Detected, located, and characterized thousands of microearthquakes in first 3 months of the Guy-Greenbrier, Arkansas, earthquake swarm, to understand its initiation process
- Analyzed well data from public Arkansas Oil and Gas Database; identified earthquakes induced by hydraulic fracturing stimulation and deep wastewater injection

### Foreshocks and mainshock nucleation

- Detected, located, and computed source parameters for foreshocks of the 1999 Mw 7.1 Hector Mine, California earthquake to gain insight into the physics of earthquake nucleation
- Interpreted that foreshocks and mainshock were triggered by a cascade of stress transfer

## Repeating earthquake and aftershock detection

• Detected repeating earthquakes and aftershocks of the 2012 Mw 7.4 Ometepec, Mexico earthquake to assess changes in deep aseismic slip, in collaboration with Prof. Luis Dominguez (UNAM ENES Morelia, Mexico)

### Aftershock detection and phase picking

- Automatically detected and picked phases on aftershock waveforms of the 2008 Wenchuan earthquake for the SeismOlympics data science competition, as part of a 4-student team
- 2013 2016 Graduate Student Researcher with Prof. Howard Zebker Radar Interferometry Applied to Induced Seismicity Department of Geophysics, Stanford University, CA

- Performed comprehensive search for crustal deformation signals in interferometric synthetic aperture radar (InSAR) data associated with potentially induced seismicity in the United States
- Conducted multi-year InSAR time series analysis with Python/MATLAB/shell scripts to estimate surface deformation from deep wastewater injection near Oklahoma City during 2011-2014
- Reported research findings in oral presentations to oil and gas industry professionals

# • 2006 – 2012 Staff Scientist Areté Associates, Northridge, CA

- Lead scientific programmer on research and development projects for remote sensing systems; performed simulation and modeling, data analysis, algorithm development, and software implementation in C++ and Fortran 90
- Implemented and tested a C++ computational geometry optimization software package
- Extensively debugged deliverable software; developed unit and regression tests
- Generated algorithm documents with conceptual and mathematical descriptions
- Wrote three technical papers summarizing data analysis procedures and results
- Presented technical briefings to customers at review meetings
- Designed, developed and implemented an interpolation algorithm to map high-resolution synthetic aperture radar data, which improved image resolution, added processing flexibility, and reduced computational cost
- Debugged, refined, and analyzed physics-based algorithms used to process optical image data: enhanced feature detection performance, reduced run-time
- Developed and implemented noise reduction algorithms, then analyzed their performance on large data sets
- Experienced with image processing, signal processing, digital filtering, numerical analysis and iterative algorithms, probability and statistics

### **TEACHING EXPERIENCE**

# • 2016 Teaching Assistant: Imaging Radar and Applications Department of Electrical Engineering/Geophysics, Stanford University

- Presented lectures on advanced synthetic aperture radar imaging methods
- Prepared solutions for and graded homework and exams
- Maintained course website and online message board for student questions
- Held office hours and exam review session

# • 2014 Teaching Assistant: Introduction to Seismology Department of Geophysics, Stanford University

- Presented lecture on signal processing techniques in seismology
- Held office hours, graded homework, and responded to student questions

### **PUBLICATIONS**

• Hauksson, E., C. Yoon, E. Yu, J. R. Andrews, M. Alvarez, R. Bhadha, and V. Thomas (2020). Caltech/USGS Southern California Seismic Network (SCSN) and Southern California Earthquake Data

- Center (SCEDC): Data Availability for the 2019 Ridgecrest Sequence, *Seismological Research Letters*, <a href="https://doi.org/10.1785/0220190290">https://doi.org/10.1785/0220190290</a>.
- Yoon, C. E., K. J. Bergen, K. Rong, H. Elezabi, W. L. Ellsworth, G. C. Beroza, P. Bailis, P. Levis (2019). Unsupervised Large-Scale Search for Similar Earthquake Signals, *Bulletin of the Seismological Society of America*, 109, 4, 1451-1468, <a href="https://doi.org/10.1785/0120190006">https://doi.org/10.1785/0120190006</a>.
- Yoon, C. E., N. Yoshimitsu, W. L. Ellsworth, and G. C. Beroza (2019). Foreshocks and Mainshock Nucleation of the 1999 M<sub>w</sub> 7.1 Hector Mine, California, Earthquake, *Journal of Geophysical Research Solid Earth*, 124, 1569-1582, https://doi.org/10.1029/2018JB016383.
- Rong, K., C. E. Yoon, K. J. Bergen, H. Elezabi, P. Bailis, P. Levis, and G. C. Beroza (2018). Locality-Sensitive Hashing for Earthquake Detection: A Case Study Scaling Data-Driven Science, *Proceedings of the VLDB Endowment*, 11, 1674-1687, <a href="https://doi.org/10.14778/3236187.3236214">https://doi.org/10.14778/3236187.3236214</a>.
- **Yoon, C. E.**, Y. Huang, W. L. Ellsworth, and G. C. Beroza (2017). Seismicity During the Initial Stages of the Guy-Greenbrier, Arkansas, Earthquake Sequence, *Journal of Geophysical Research Solid Earth*, 122, https://doi.org/10.1002/2017JB014946.
- Bergen, K., C. Yoon, and G. C. Beroza (2016). Scalable Similarity Search in Seismology: A New Approach to Large-Scale Earthquake Detection, *Proceedings of the 9<sup>th</sup> International Conference on Similarity Search and Applications*, 301-308, https://doi.org/10.1007/978-3-319-46759-7 23.
- Yoon, C. E., O. O'Reilly, K. J. Bergen, and G. C. Beroza (2015). Earthquake detection through computationally efficient similarity search, *Science Advances*, 1, e1501057, <a href="https://doi.org/10.1126/sciadv.1501057">https://doi.org/10.1126/sciadv.1501057</a>.

### **INVITED TALKS**

- Yoon, C. E., G. C. Beroza, K. J. Bergen, K. Rong, H. Elezabi, P. Bailis, and P. Levis. A FAST Data-Mining Approach for Similar Earthquake Detection, 2018 SSA Meeting, Miami, Florida.
- Big data analytics for finding small earthquakes, UC Santa Cruz IGPP Seminar, January 2018.
- Yoon, C., K. Bergen, K. Rong, H. Elezabi, P. Bailis, P. Levis, and G. Beroza. Efficient blind search for similar-waveform earthquakes in years of continuous seismic data, 2017 AGU Meeting, New Orleans, Louisiana, Abstract S21E-01.
- Earthquake Detection Through Computationally Efficient Similarity Search (with K. Bergen), U.S. Geological Survey Earthquake Science Center Seminar, Menlo Park, CA, August 2015, <a href="https://earthquake.usgs.gov/contactus/menlo/seminars/999">https://earthquake.usgs.gov/contactus/menlo/seminars/999</a>.

### **ORAL PRESENTATIONS**

- Dominguez, L. A., T. Taira, W. Frank, **C. Yoon**, M. A. Santoyo, D. Legrand, and A. Iglesias, Detection of missing foreshocks and afterslip estimates of the 2012 M<sub>\*</sub> 7.4 Ometepec earthquake, Hazard Assessment of Large Earthquakes and Tsunamis in the Mexican Pacific Coast, SATREPS workshop, July 2017.
- Dominguez, L. A., T. Taira, W. Frank, **C. Yoon**, M. A. Santoyo, D. Legrand, and A. Iglesias, Investigation of the foreshock and aftershock sequence of the 2012 M<sub>\*</sub> 7.4 Ometepec earthquake using fingerprint and matched filter techniques, JpGU-AGU Joint Meeting, May 2017.
- Yoon, C., Y. Huang, W. Ellsworth, and G. Beroza, Microearthquakes Induced by Hydraulic Fracturing and Wastewater Injection in Guy-Greenbrier, Arkansas, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, May 2017.
- Yoon, C., N. Yoshimitsu, W. Ellsworth, and G. Beroza, Another Look at the Foreshocks of the 1999 M., 7.1 Hector Mine, California, Earthquake, SSA Annual Meeting, April 2017.

- Yoon, C., Y. Huang, W. Ellsworth, and G. Beroza, New Evidence for Earthquakes Induced by Hydraulic Fracturing and Wastewater Injection in Guy-Greenbrier, Arkansas, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, October 2016.
- Yoon, C., and H. Zebker, InSAR Time Series Analysis Reveals the Absence of Injection-Induced Surface Deformation in Central Oklahoma, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, October 2016.
- Yoon, C., Y. Huang, W. Ellsworth, and G. Beroza, The initial stages of the Guy-Greenbrier sequence using FAST earthquake detection, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, May 2016.
- Yoon, C., and H. Zebker, InSAR Observations of Injection-Related Deformation, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, February 2015.
- Yoon, C. E., O. J. O'Reilly, K. Bergen, and G. C. Beroza, Computationally Efficient Search for Similar Seismic Signals in Continuous Waveform Data over a Seismic Network, 2014 AGU Meeting, Abstract S52A-04.
- Yoon, C., and H. Zebker, InSAR Observations of Deformation at Oil and Gas Production Sites, Stanford Center for Induced and Triggered Seismicity Affiliates Meeting, October 2014.
- Yoon, C. E., O. J. O'Reilly, and G. C. Beroza, Waveform Fingerprinting for Efficient Seismic Signal Detection, 2013 AGU Meeting, Abstract S21D-02.

### POSTER PRESENTATIONS

- Yoon, C., N. Yoshimitsu, W. Ellsworth, and G. Beroza, Foreshocks and Mainshock Nucleation of the 1999 M. 7.1 Hector Mine, California, Earthquake, 2019 AGU Meeting, Abstract S21F-0580.
- **Yoon, C.**, S. Schwarz, and V. Thomas, Earthquake Notification Service (ENS): Present Capabilities and Next-Generation Product Ideas, 2019 SCEC Meeting, Abstract 304, <a href="https://www.scec.org/publication/9826">https://www.scec.org/publication/9826</a>.
- Bergen, K. J., C. E. Yoon, K. Rong, P. Bailis, and G. C. Beroza. FAST: a data mining approach to large-scale earthquake detection, 2018 AGU Meeting, Abstract S11E-0416.
- Beroza, G. C., Y. Huang, W. L. Ellsworth, and C. E. Yoon, Seismicity During the First Three Months of the Guy-Greenbrier, Arkansas, Earthquake Sequence, SEG/SPE Workshop on Injection-Induced Seismicity, Dallas, Texas, November 2017.
- Yoon, C., N. Yoshimitsu, W. Ellsworth, and G. Beroza, How did the 1999 M. 7.1 Hector Mine, California, earthquake begin? Insights from foreshocks, 2<sup>st</sup> school on earthquakes: nucleation, triggering, rupture, and relationship with aseismic processes, Cargese, Corsica, October 2017.
- Yoon, C. E., K. Bergen, K. Rong, H. Elezabi, P. Bailis, P. Levis, W. L. Ellsworth, and G. C. Beroza, Efficient blind search for small similar-waveform earthquakes in a decade of continuous seismic data (2007-2017) in coastal central California, 2017 SCEC Meeting, Abstract 024, <a href="https://www.scec.org/publication/7749">https://www.scec.org/publication/7749</a>.
- Yoon, C. E., Y. Huang, W. L. Ellsworth, and G. C. Beroza. The Initial Stages of the Guy-Greenbrier, Arkansas, Earthquake Sequence: Induced by Both Wastewater Injection and Hydraulic Fracturing Amid Natural Seismicity, 2016 AGU Meeting, Abstract S43C-2883.
- Yoon, C. E., Y. Huang, W. L. Ellsworth, and G. C. Beroza, Earthquakes Induced by Hydraulic Fracturing and Wastewater Injection in Guy-Greenbrier, Arkansas, 2016 SCEC Meeting, Abstract 194.
- Yoon, C. E., O. O'Reilly, K. Bergen, Y. Huang, and G. C. Beroza, Searching for Unknown Earthquakes in the Guy-Greenbrier, Arkansas, Earthquake Sequence using Efficient Waveform Similarity Search, 2015 AGU Meeting, Abstract S13B-2850.
- Bergen, K., C. E. Yoon, O. J. O'Reilly, and G. C. Beroza, Unsupervised Approaches for Post-Processing in Computationally Efficient Waveform-Similarity-Based Earthquake Detection, 2015 AGU Meeting, Abstract S53A-2777, <a href="https://membership.agu.org/files/2016/02/kbergen\_AGU15.pdf">https://membership.agu.org/files/2016/02/kbergen\_AGU15.pdf</a>.

- Bergen, K., C. Yoon, O. O'Reilly, Y. Huang, and G. Beroza, Fingerprint and Similarity Thresholding (FAST) for Computationally Efficient Earthquake Detection, 2015 SCEC Meeting, Abstract 132.
- Yoon, C., O. O'Reilly, K. Bergen, and G. Beroza, Computationally Efficient Earthquake Detection with Continuous Seismic Waveform Data, Stanford-USTC-MIT (SUM) Geoscience Summer Camp, Hefei, China, September 2015.
- Yoon, C., O. O'Reilly, K. Bergen, and G. Beroza, Computationally Efficient Earthquake Detection with Continuous Seismic Waveform Data, 9<sup>h</sup> International Workshop on Statistical Seismology (Statsei9), Potsdam, Germany, June 2015, <a href="https://statsei9.quake.gfz-potsdam.de/lib/exe/fetch.php?media=13">https://statsei9.quake.gfz-potsdam.de/lib/exe/fetch.php?media=13</a> presentations:poster yoon.pdf.
- Yoon, C., O. O'Reilly, K. Bergen, and G. Beroza, Computationally Efficient Search for Similar Seismic Signals in Continuous Waveform Data over the Northern California Seismic Network, 2014 SCEC Meeting, Abstract 162.
- O'Reilly, O. J., C. E. Yoon, and G. C. Beroza, Similarity Search for Continuous Seismic Data, 2013 AGU Meeting, Abstract S11B-2319.
- O'Reilly, O. J., C. E. Yoon, and G. C. Beroza, Similarity Search for Continuous Seismic Data, 2013 SCEC Meeting, Abstract 107.

# **COMPUTER SKILLS**

- **Programming Languages (proficient):** C++, Python, MATLAB, bash shell script, Fortran
- Programming Languages (some experience): C, Java, Perl, IDL
- Databases: MySQL
- Version Control: Subversion, git
- Compilers: gcc/g++/gfortran, make, Xcode, Microsoft Visual Studio, Eclipse
- Operating Systems: Linux (including clusters), Mac OS X, Windows
- Documentation: doxygen, Javadoc, Markdown, MkDocs, LaTeX, Microsoft Word
- Software Tools: vim, tmux
- Scientific Visualization: matplotlib, GMT, Google Earth, Adobe Illustrator, Microsoft PowerPoint
- Seismology: ObsPy, SAC, VELEST, HYPOINVERSE, hypoDD

### PROFESSIONAL ACTIVITIES

- Reviewer for Journal of Geophysical Research Solid Earth (2019)
- Reviewer for Seismological Research Letters (2019)
- Proposal reviewer for National Science Foundation Earth Sciences (2019)

### PROFESSIONAL AFFILIATIONS

- American Geophysical Union (AGU), 2008 present
- Seismological Society of America (SSA), 2012 2018
- Institute of Electrical and Electronics Engineers (IEEE), 2008 2012

### **MEDIA COVERAGE**

- "Big One still looms", July 15, 2019, Daily Press, Victorville, CA, <a href="https://www.vvdailypress.com/news/20190715/big-one-still-looms">https://www.vvdailypress.com/news/20190715/big-one-still-looms</a>
- "The Big One is likely overdue in the Coachella Valley, where major earthquake faults connect", July 8, 2019, The Desert Sun, Palm Springs, CA, <a href="https://www.desertsun.com/story/news/2019/07/08/palm-springs-coachella-valley-area-likely-overdue-major-earthquake-san-andreas-fault/1675158001/">https://www.desertsun.com/story/news/2019/07/08/palm-springs-coachella-valley-area-likely-overdue-major-earthquake-san-andreas-fault/1675158001/</a>
- Interviews following the July 4 M6.4 and July 5 M7.1 Ridgecrest, California, earthquakes: TV (Fox 11 Los Angeles), video (Voice of America), radio (100.7 San Diego)

## **AWARDS AND HONORS**

- Exceptional Thesis Award, Stanford Geophysics, 2018
- Joshua L. Soske Memorial Fellowship, Stanford School of Earth Sciences, 2015
- Oral Presentation Award, Stanford School of Earth Sciences Research Review, 2014, 2015
- Chevron Fellow, Stanford Graduate Fellowship, 2013-2016
- E. Lee Kinsey Scholarship, UCLA Physics and Astronomy, 2006
- Rudnick-Abelmann Scholarship, UCLA Physics and Astronomy, 2005
- Regents Scholarship, UCLA, 2002-2006