EDUCATION

2013 Ph.D. - University of Arizona

Major: Hydrology and Water Resources

Minor: Applied Mathematics (Probability & Statistics)

Advisor: Hoshin V. Gupta (Regents' Professor)

Dissertation Title: Diagnostics and Generalizations for Parametric State Estimation

2009 M.S. - University of Arizona -

Major: Agricultural and Biosystems Engineering Advisors: Donald C. Slack & M. Susan Moran

2006 B.S. – Purdue University

Major: Mathematics

Minor: Music History & Theory

PROFESSIONAL EXPERIENCE

2020 – Present: Assistant Professor; University of California Davis

Department of Land, Air, and Water Resources

2020 – Present: Visiting Faculty; Google Research

2017 – 2020: Assistant Professor; University of Alabama

Department of Geological Sciences

2016 – 2020: Research Assistant Professor (adjunct); University of Maryland Baltimore

County, Department of Computer Science and Electrical Engineering

2015 – 2017: Project Scientist; National Center for Atmospheric Research

2013 – 2017: Research Scientist; Science Systems and Applications Inc. &

Science Applications International Corp. NASA Goddard Space Flight Center

COMPETITIVE FUNDING

- 2020: (Co-PI) NRCS Grazing Land CEAP (\$388,791)
- 2018: (PI) NCAR COMET National Water Center Cooperative Project (\$39,129): Process Diagnostics and Efficient Parameter Estimation for Distributed Hydrologic Models with WRF-Hydro
- 2017: (PI) NASA ROSES Terrestrial Hydrology Program (\$408,464): *Multivariate Hydrologic Data Assimilation for Model Structural Learning and Process-Diagnostics*
- 2016: (Co-I) NASA ROSES Advanced Information Systems Technology (Co-I Share = \$31,565): Climate Risks in the Water Sector: Advancing the Readiness of Emerging Technologies in Climate Downscaling and Hydrologic Modeling
- 2014: (Co-I) NASA Earth Science Technology Office; Advanced Information Systems Technology: *Quantum Annealing Computing for Carbon Data Assimilation in the LIS Model*

- 2014: (PI) NSF Geosciences; EAR Postdoctoral Fellowship (\$174,000; awarded but declined by PI): *Information-Based Diagnostics of Land Surface Models for Prediction Under Climate Change*
- 2014: (Science-PI) NASA Earth Science Technology Office; Quick Response Submission (\$98,000): Next Generation Data Assimilation Capabilities in a Mission Simulation Platform to Increase the Value of Terrestrial Remote Sensing Observations
- 2012: NSF East Asia and Pacific Summer Institute; Graduate Student Fellowship (\$4,500)
- 2011 & 2012: Achievement Rewards for College Scientists (\$11,000 x 2 separate awards)

TEACHING EXPERIENCE

- **Sustainable Earth** (GEO-105); Undergraduate; Enrollment = 80 110; Student Instructor Evaluation = 4.52, 4.36, 4.44 (dept. avg. = 4.20; college avg. = 4.19)
- *Geostatistics* (GEO-425/525); Undergraduate/Graduate; Enrollment = 18; Student Instructor Evaluation = 4.46

MENTORING EXPERIENCE

- 2018: Primary supervisor of two PhD students and one MS student.
- 2014 2019: Member of thesis/dissertation committees at University of Washington (completed 2021) and Georgia Tech (completed 2019).
- 2017 2018: Supervised three undergraduate research students. All three students presented their work as first authors at the 2018 AGU Fall Meeting.
- 2008 2009: NASA Space Grant Mentor; supervised one 9-month undergraduate research project.

PROFESSIONAL SERVICE

2019: Organizing committee and lecturer at the SITES Summer School on Information Theory in the Earth Sciences; Santander, Spain; http://sites-2019.ihcantabria.com

2018: Water Resources Research Editor's Citation for Excellence in Refereeing; https://eos.org/agu-news/in-appreciation-of-agus-outstanding-reviewers-of-2017

2018: Organizing committee for the NASA Goddard Workshop on Artificial Intelligence; https://asd.gsfc.nasa.gov/conferences/ai/

2017 – 2018: NASA Goddard Artificial Intelligence Working Group

2016 & 2018: Co-Organized two special issues of Water Resources Research

- 2016: Engagement, Communication, and Decision-Making Under Uncertainty
- 2018: Big Data & Machine Learning in Water Sciences

2016 - 2020: Organizing committee – workshop series on Information Theory in the Earth Sciences:

• 2016: 1st Workshop – Karlsruhe Institute of Technology, Germany

- 2018: 2nd Workshop Environmental Hydraulics Institute Cantabria, Spain
- 2019: 3rd Workshop Environmental Hydraulics Institute Cantabria, Spain
- 2020: 4th Workshop Northern Arizona University, Flagstaff, AZ USA

2015 – 2017: Secretary (3rd ranking member) of the American Geophysical Union Hydrology Section Technical Committee on Uncertainty Quantification (2-year rotating appointments)

FULL LIST OF JOURNAL ARTICLES (h-index: Web of Science=13; Google=16) ----- In Review ------

- M. Rahman, J.M. Frame, J. Lin <u>G.S. Nearing</u>; Hidden Stories: Topic Modeling in Hydrology Literature. *in review at Water Resources Research*.
- J.M. Frame, <u>G.S. Nearing</u>, F. Kratzert, A. Raney, M. Rahman, F. Salas; Post processing the U.S. National Water Model with a Long Short-Term Memory network. *in review at Journal of American Water Resources Association*.
- M. Gauch, F. Kratzert, D. Klotz, <u>G.S. Nearing</u>, J. Lin, S. Hochreiter; Rainfall–Runoff Prediction at Multiple Timescales with a Single Long Short-Term Memory Network *in review at Hydrology and Earth System Sciences Discussions*.

----- 2021 -----

1. F. Kratzert, D. Klotz, S. Hochreiter, <u>G.S. Nearing</u>; A Note on Leveraging Synergy in Multiple Meteorological Datasets with Deep Learning for Rainfall-Runoff Modeling? *in review at Hydrology and Earth System Sciences Discussions*.

----- 2020 -----

- 2. <u>G.S. Nearing</u>, F. Kratzert, A.K. Sampson, C.S. Pelissier, D. Klotz, J.M. Frame, H.V. Gupta; What role does hydrological science play in the age of machine learning? *Water Resources Research* (Q1; IF=2.60) November, 2020
- **3.** C.S. Pelissier, J.M. Frame, <u>G.S. Nearing</u>; Combining Parametric Land Surface Models with Machine Learning; *Proceedings of IGARSS 2020*.
- 4. **G.S. Nearing**, C.S. Pelissier, F. Kratzert, H.V. Gupta, A.K. Sampson, D. Klotz; Physically-Based Machine Learning for Hydrological Modeling; *44th NOAA Climate Diagnostics and Prediction Workshop*
- 5. J. Qiu, W.T. Crow, J. Dong, <u>G.S. Nearing</u>; Land Surface Model Representation of the Mutual Information Context between Multi-Layer Soil Moisture and Evapotranspiration; in review at *Hydrology and Earth Systems Science* (Q1; IF=2.02) February, 2020.
- 6. **G.S. Nearing**, B.L. Ruddell, A.R. Bennett, C. Prieto, H.V. Gupta; Debates: Does Information Theory Provide a New Paradigm for Earth Science? Hypothesis Testing; *Water Resources Research Research* (Q1; IF=2.60), January 2020.

----- 2019 ------

- 7. F. Kratzert, D. Klotz, M. Herrnegger, A.K. Sampson, S. Hochreiter, **G.S. Nearing***; Prediction in Ungauged Basins with Long Short-Term Memory Networks; *Water Resources Research* (Q1; IF=2.60), November 2019 (*corresponding author).
- 8. F. Kratzert, D. Klotz, G. Shalev, G. Klambauer, S. Hochreiter*, <u>G.S. Nearing</u>*; Benchmarking a Catchment-Aware Long Short Term Memory Network (LSTM) for Large-Scale Hydrological Modeling; *Hydrology and Earth System Science* (Q1; IF=2.02), November 2019 (*shared supervising author).
- 9. B.L. Ruddell, D.T. Drewry, **G.S. Nearing**; Process diagnostics as tradeoffs between functional and predictive performance in complex ecohydrology models using information transfer metrics; *Water Resources Research* (Q1; IF=2.60), August 2019.
- 10. A.R. Bennett, B. Nijssen, G.O. Ou, M.P. Clark, <u>G.S. Nearing</u>; Quantifying process connectivity with transfer entropy in hydrologic models; *Water Resources Research* (Q1; IF=2.60), April 2019.
- 11. S. Yatheendradas, D. Kirschbaum, <u>G.S. Nearing</u>, J. Vrugt, R. Baum, R. Wooten, N. Lu, B. Cosgrove; Sensitivity of modeled slope failure uncertainty to rain data sources over North Carolina; *Computational Geosciences* (Q1; IF=0.99), January 2019.

----- 2018 -----

- 12. C. Prieto, U. Ehret, **G.S. Nearing**; An Information Approach to the Earth Sciences; *EOS, Transactions, American Geophysical Union* (Q2; IF=0.38), September 2018.
- 13. <u>G.S. Nearing</u>, B.L. Ruddell, M.P. Clark, B. Nijssen, C.D. Peters-Lidard; Benchmarking & Process Diagnostics of Land Models; *Journal of Hydrometeorology* (Q1; IF=2.24), September 2018.
- 14. N. Addor; <u>G.S. Nearing</u>; C. Prieto; A. Newman; N. Le Vine; M. Clark; A Ranking of Hydrological Signatures Based on Their Predictability in Space; *Water Resources Research* (Q1; IF=2.60), September 2018.
- **15.** <u>G.S. Nearing</u>, S. Yatheendradas, W.T. Crow, X. Zhan, J. Liu, F. Chen; The Efficiency of Data Assimilation; *Water Resources Research* (Q1; IF=2.60), July 2018. **Selected for AGU Research Spotlight.**
- 16. K. Arsenault, <u>G.S. Nearing</u>, S. Wang, S. Yatheendradas, C.D. Peters-Lidard; Parameter Sensitivity of the Noah-MP Land Surface Model with Dynamic Vegetation; *Journal of Hydrometeorology* (Q1; IF=2.24), April 2018.
- 17. **G.S. Nearing**, H.V. Gupta; Ensembles vs. Information Theory: Supporting Science under Uncertainty; *Frontiers of Earth Science* (Q1; IF=1.25), April 2018.

----- 2017 ------

- 18. R. Hooper, **G.S. Nearing**, L.S. Condon; Using the National Water Model as a Hypothesis- Testing Tool; *Open Water Journal* (journal not ranked), November 2017.
- 19. A.J. Newman, N. Mizukami; M.P. Clark, A.W. Wood, B. Nijssen, **G.S. Nearing**; Benchmarking of A Physically Based Hydrology Model; *Journal of Hydrometeorology*

- (Q1; IF=2.24), August 2017.
- 20. **G.S. Nearing**, S. Yatheendradas, W.T. Crow, D.D. Bosch, M.H. Cosh, D.C. Goodrich, P.J. Starks, M.S. Seyfried; Nonparametric Triple Collocation; *Water Resources Research* (Q1; IF=2.60), May 2017.

----- 2016 -----

- 21. J. Qiu, W.T. Crow, <u>G.S. Nearing</u>; The Impact of Vertical Measurement Depth on the Information Content of Soil Moisture for Latent Heat Flux Estimation; *Journal of Hydrometeorology* (Q1; IF=2.24), September 2016.
- 22. **G.S. Nearing**, Y. Tian, H.V. Gupta, M.P. Clark, S.V. Weijs, K.W. Harrison; A Philosophical Basis for Hydrologic Uncertainty; *Hydrological Sciences Journal* (Q1; IF=0.94), July 2016.
- 23. **G.S. Nearing**, D.M. Mocko, C.D. Peters-Lidard, S.V. Kumar, Y. Xia; Benchmarking NLDAS-2 Soil Moisture and Evapotranspiration to Separate Uncertainty Contributions; *Journal of Hydrometeorology* (Q1; IF=2.24), March 2016.
- 24. Y. Tian, <u>G.S. Nearing</u>, C.D. Peters-Lidard, K.W. Harrison, L. Tian; Performance Metrics, Error Modeling, and Uncertainty Quantification; *Monthly Weather Review* (Q1; IF=2.64), February 2016.

----- 2015 -----

- 25. S.V. Kumar, et al.; Evaluating the Utility of Satellite Soil Moisture Retrievals over Irrigated Areas and the Ability of Land Data Assimilation Methods to Correct for Unmodeled Processes; *Hydrology and Earth System Science* (Q1; IF=2.02), November 2015.
- 26. N. Haughton, et al.; The Plumbing of Land Surface Models: Is Poor Performance a Result of Methodology or Data Quality? *Journal of Hydrometeorology* (Q1; IF=2.24), June 2015.
- 27. M.J. Best, et al.; The Plumbing of Land Surface Models. *Journal of Hydrometeorology* (Q1; IF=2.24), June 2015.
- 28. **G.S. Nearing**, H.V. Gupta; The Quantity and Quality of Information in Hydrologic Models. *Water Resources Research* (Q1; IF=2.60), January 2015.

----- 2014 -----

- 29. J. Qiu, W.T. Crow, <u>G.S. Nearing</u>, X. Mo, S. Liu; The Impact of Vertical Measurement Depth on the Information Content of Soil Moisture Time Series Data. *Geophysical Research Letters* (Q1; IF=2.66), July 2014.
- 30. **G.S. Nearing**; Comment on "A blueprint for process-based modeling of uncertain hydrological systems" by Montanari and Koutsoyiannis. *Water Resources Research* (Q1; IF=2.60), July 2014.
- 31. W. Gong, D. Yang, H.V. Gupta, <u>G.S. Nearing</u>; Estimating Information Entropy for Hydrologic Data: One-Dimensional Case. *Water Resources Research* (Q1; IF=2.60), June 2014.

32. H.V. Gupta, G.S. Nearing; Debates on Water Resources: Using Models and	d Data to Learn
- A Systems Theoretic Perspective on the Future of Hydrological Science.	Water
Resources Research (Q1; IF=2.60), June 2014.	

----- 2013 -----

- 33. **G.S. Nearing**, H.V. Gupta, W.T. Crow; Information Loss in Approximately Bayesian Estimation Techniques: A Comparison of Generative and Discriminative Approaches to Estimating Agricultural Productivity. *Journal of Hydrology* (Q1; IF=1.83), December 2013.
- 34. **G.S. Nearing**, H.V. Gupta, W.T. Crow, W. Gong; An Approach to Quantifying the Efficiency of a Bayesian Filter. *Water Resources Research* (Q1; IF=2.60), April 2013.
- 35. **G.S. Nearing**, M. Tuller, S.B. Jones, R. Heinse, M.S. Meding; Electromagnetic Induction for Mapping Physical and Chemical Properties of Mine Tailings Deposits. *Journal of Applied Geophysics* (Q2; IF=0.64), February 2013.

----- 2012 ------

- 36. **G.S. Nearing**, W.T. Crow, K.R. Thorp, M.S. Moran, R.R. Reichle, H.V. Gupta; Assimilating Remote Sensing Observations of Leaf Area Index and Soil Moisture for Wheat Yield Estimates: An Observing System Simulation Experiment. *Water Resources Research* (Q1; IF=2.60), May 2012.
- 37. **G.S. Nearing**, M.S. Moran, R.L. Scott, G.E. Ponce-Campos; Coupling Diffusion and Maximum Entropy Models to Estimate Thermal Inertia and Soil Moisture. *Remote Sensing of Environment* (Q1; IF=3.12), April 2012.
- 38. K.R. Thorp, J.W. White, C.H. Porter, G. Hoogenboom, <u>G.S. Nearing</u>, A.N. French; Methodology to Evaluate the Performance of Simulation Models for Alternative Compiler and Operating System Configurations. *Computers and Electronics in Agriculture* (Q1; IF=0.81), February 2012.

----- 2010 -----

- 39. **G.S. Nearing**, M.S. Moran, K.R. Thorp, C.D. Holifield-Collins, D.C. Slack; Likelihood Parameter Estimation for Calibrating a Soil Moisture Model Using Radar Backscatter. *Remote Sensing of Environment* (Q1; IF=3.12), Nov 2010.
- 40. M.S. Moran, et al.; Hydrologic Response to Precipitation Pulses Under and Between Shrubs in the Chihuahuan Desert, Arizona. *Water Resources Research* (Q1; IF=2.60), October 2010.

----- 2009 -----

41. M.S. Moran, et. al; Partitioning Evapotranspiration in Semiarid Grassland and Shrubland Ecosystems Using Time Series of Soil Surface Temperature. *Agricultural and Forest Meteorology* (Q1; IF=1.82), January 2009.

PEER REVIEWED BOOK CHAPTERS & CONFERENCE PROCEEDINGS

- 42. H. Moradkhani, <u>G.S. Nearing</u>, P. Abbaszadeh, S. Pathiraja; Fundamentals of Data Assimilation and Theoretical Advances; in Duan, Pappenberger, Thielen, Wood, Cloke (Eds) *Handbook of Hydrometeorological Ensemble Forecasting*, Springer, Berlin, accepted February 2019.
- 43. **G.S. Nearing**; Estimating Probability Distributions for Hydrometeorological Applications; in Duan, Pappenberger, Thielen, Wood, Cloke (Eds) *Handbook of Hydrometeorological Ensemble Forecasting*, Springer, Berlin, accepted February 2019.
- 44. Mladenova, <u>G.S. Nearing</u>, J. Bolten, V. Lakshmi; Chapter 7: Remote Sensing Techniques and Data Assimilation for Hydrological Modeling; in Singh (Ed) *Handbook of Hydrology*, McGraw-Hill Education, 2016.
- 45. **G.S. Nearing**, C.L. Winter, D.M. Tartakovsky; A Conditional Probability Model for Groundwater Risk Assessment; in Carrera (Ed) *Proceedings of the XVIIIth International Conference on Computation Methods in Water Resources*, Barcelona Spain, January 2010.

INVITED CONFERENCE PRESENTATIONS

(invited only - contributed or submitted abstracts not listed)

- 1. Hydrological Modeling with Deep Learning (Invited) at the American Meteorological Society's 35th Conference on Hydrology, virtual, January 2021.
- 2. Machine Learning is Central to the Future of Hydrological Modeling at the European Geosciences Union Annual Meeting, virtual, April 2020
- 3. Keynote talk at Google's 'Flood Forecasting Meets Machine Learning' Workshop; February, 2020; Tel Aviv, Israel
- 4. Keynote Talk: *Physically Based Machine Learning for Hydrological Modeling*; NOAA 44th Annual Climate Diagnostics and Prediction Workshop; October 2019; Durham, NC, USA; Meeting Program: www.cpc.ncep.noaa.gov/products/outreach/CDPW/44/programs/cdpw44 oral presentations.pdf
- 5. Multivariate Data Assimilation with Machine Learning for Streamflow Modeling; American Geophysical Union Fall Meeting; December 2019; San Francisco, CA, USA
- 6. Keynote Talk: *Using Embedding Layers in Deep Learning Networks to Understand and Complexity, Similarity, and Nonstationarity in Rainfall/Runoff Processes*; European Geoscience Union 10th Leonardo Conference; October 2019; Esch-sur-Alzette, Luxembourg
- 7. The Need for Physics-Informed Machine Learning in Hydrology NSF TRIPODS 2nd Southwest Summer Conference; May 2019; Tucson, AZ, USA; Meeting Website: sites.google.com/math.arizona.edu/tripodssummerconference2019 Lecture Video: arizona.hosted.panopto.com/Panopto/Pages/Viewer.aspx?id=04093bcf-ebf8-4004-9674-aa54 01684291
- 8. Calibrating a Terrestrial Hydrology Model for Process-Realism; American Geophysical Union Fall Meeting; December 2018; Washington DC, USA

- 9. *Process-Based Models under Nonstationarity*; American Geophysical Union Fall Meeting; December 2018; Washington DC, USA
- 10. Diagnosing Earth Systems Models: Confirmatory Data Analytics with Machine Learning; NASA AMES Machine Learning Workshop; August 2017; Mountain View, CA, USA
- 11. *Uncertainty vs. Information*; European Geophysical Union General Assembly; April 2016; Vienna, Austria
- 12. *The Role of Data Assimilation in Model Diagnostics;* American Geophysical Union Fall Meeting; December 2016; San Francisco, CA, USA
- 13. *Understanding the Information Content of Remote Sensing Observations;* Annual Meeting of the Soil Science Society of America; November 2016; Phoenix, AZ, USA
- 14. What does it mean to say that a model provides information? European Geophysical Union General Assembly; April 2016; Vienna, Austria
- 15. The Value of Data Assimilation for Dynamic Vegetation Monitoring in Land Surface Modeling; American Geophysical Union Fall Meeting; December 2015; San Francisco, CA, USA
- 16. Hunting Solomonoff's Swans: Exploring the Boundary Between Physics and Statistics in Hydrological Modeling; American Geophysical Union Fall Meeting; December 2014; San Francisco, CA, USA
- 17. The Amount and Quality of Information Provided by Models and Induction; Society for Industrial and Applied Mathematics Conference on Uncertainty Quantification; April 2014; Savannah, GA, USA
- 18. *Information-Based Analysis of Data Assimilation;* American Geophysical Union Fall Meeting; December 2013; San Francisco, CA, USA
- 19. *Improving Yield Forecasting using Root Zone Soil Moisture;* Biological Systems Simulation Group 40th Annual Symposium; April 2010; Phoenix, AZ, USA