## Andrew Bennett

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EDUCATION University of Washington

Sept. 2016 - Mar. 2021

Ph.D. - Department of Civil and Environmental Engineering Hydrology and hydrodynamics, Advisor: Bart Nijssen

Dissertation: Applications of information theory and machine learning for hydrologic modeling

University of Wisconsin, La Crosse

Sept. 2008 - May 2013

Bachelor of Science - Physics and Mathematics

PROFESSIONAL University of Arizona

Sept. 2021 - Present

Experience Postdoctoral Research Associate - Department of Hydrology and Atmospheric Sciences

University of Washington

Apr. 2021 - Sept. 2021

Research Scientist - Department of Civil and Environmental Engineering

Oak Ridge National Laboratory

Oct. 2013 to Aug. 2016

Research Associate - Computer Science and Mathematics Division

University of Wisconsin, La Crosse

Jan. 2012 to May 2013.

Physics Tutor

STUDENT MENTORING

Peter Sumner JISAO Summer Intern

Summer 2017

Project: Google Earth Analysis of Soil Moisture and Landslide Risk in the Pacific Northwest

Tushar Khurana Undergraduate Research Assistant

Fall 2018

Project: Information Theoretic Analysis of Hydrological Land Surface Models

Adi Stein Undergraduate Research Assistant

Spring 2019- Summer 2021

Project: Developing spatially-consistent and process-aware bias-correction methods for streamflow simulations

Teaching

**Instructor** University of Arizona HWRS 401/501

Fall 2022

Tools for Data Handling and Analysis in Water, Weather, & Climate

Guest lecturer University of Saskatchewan GEOG 825

Winter 2022

Process Based Modeling

Guest lecturer University of Saskatchewan GEOG 825

Fall 2020

Meteorologic Forcing Data

Excercise development CUAHSI Virtual Snow Modeling

Fall 2019

Snow modeling with SUMMA

Awards & Honors

SERVICE

Workshop speaker Knowledge Guided Machine Learning Workshop Embedding neural networks to simulate turbulent heat fluxes in a process-based hydrologic modeling framework	Summer 2021
Seminar University of Arizona TRIPODS Seminar Embedding neural networks into physics-based hydrologic models	Spring 2021
Seminar University of Washington Data Science Seminar Embedding neural networks into large Earth systems models	Winter 2020
Public speaker Puget Sound Programming Python Meetup Algorithms, information and the environment	Winter 2019
Workshop instructor WaterHackWeek MetSim: A python library for meteorological data simulation	Spring 2019
ACII Outstanding Student Presentation Award	2020
EGU Outstanding Student Poster and Pico Award	2020 2019 2013
AGU Outstanding Student Presentation Award EGU Outstanding Student Poster and Pico Award COMAP Mathematical Contest in Modeling Honorable Mention  Session Convener Frontiers in Hydrology Meeting: "Emphasizing F, I and R in FAIR hydrology: Bottlenecks and solutions to making hydrologic science more reproducible"	2019 2013
EGU Outstanding Student Poster and Pico Award COMAP Mathematical Contest in Modeling Honorable Mention  Session Convener Frontiers in Hydrology Meeting: "Emphasizing F, I and R in FAIR hydrology:	2019
EGU Outstanding Student Poster and Pico Award COMAP Mathematical Contest in Modeling Honorable Mention  Session Convener Frontiers in Hydrology Meeting: "Emphasizing F, I and R in FAIR hydrology: Bottlenecks and solutions to making hydrologic science more reproducible"  Poster Judge	2019 2013 June 2022
EGU Outstanding Student Poster and Pico Award COMAP Mathematical Contest in Modeling Honorable Mention  Session Convener Frontiers in Hydrology Meeting: "Emphasizing F, I and R in FAIR hydrology: Bottlenecks and solutions to making hydrologic science more reproducible"  Poster Judge University of Arizona - El Dia de la Agua y la Atmosphera  Travel Grant Committee	2019 2013 June 2022 March 2022

- Geophysical Research Letters
- Hydrologic Processes
- Hydrologic & Earth Systems Science
- Journal of Hydrology
- Journal of Advances in Modeling Earth Systems
- Journal of Open Source Software
- Stochastic Environmental Research and Risk Assessment
- Water Resources Resources

# SOFTWARE & TECHNICAL SKILLS

#### **Programming Languages:**

Bash, C, Fortran, Python, Java, Javascript, Julia, R, LaTeX

#### Technologies:

git, NetCDF, HPC systems, Python packaging (pypi, conda), automake, pytorch, tensorflow

#### Open Source Development Experience:

- **SUMMA**: https://github.com/NCAR/summa
- pysumma: https://github.com/UW-Hydro/pysumma
- bmorph: https://github.com/UW-Hydro/bmorph

- MetSim: https://github.com/UW-Hydro/MetSim
- ParFlow: https://github.com/parflow/parflow
- LIVVkit: https://github.com/LIVVkit/LIVVkit
- Eclipse ICE: https://gitlab.eclipse.org/eclipse/ice/ice

EXTERNAL FUNDING

#### ESIP - Machine Learning Tutorial

August 2022

\$5,000

Lead PI: High resolution predictions of global snow using recurrent neural networks

# BOOK CHAPTERS & MONOGRAPHS

Bennett, Andrew. "AI for Physics-inspired Hydrology Modeling". Earth Science Artificial Intelligence, edited by Ziheng Sun, Nicoleta Cristea, and Pablo Rivas, in review, Elsevier, 2022, chapter 12.

### Peer-Reviewed

#### Publications

Knoben, Wouter Johannes Maria, Martyn P. Clark, Jerad Bales, **Bennett, Andrew**, S. Gharari, et al. "Community Workflows to Advance Reproducibility in Hydrologic Modeling:nbsp; Separating model-agnostic and model-specific configuration steps in applications of large-domain hydrologic models". *Water Resources Research*, vol. in revision, 2021.

Bennett, Andrew and Bart Nijssen. "Explainable AI uncovers how neural networks learn to regionalize in simulations of turbulent heat fluxes at FluxNet sites". Water Resources Research, 2021, in revision.

Cristea, Nicoleta C., **Bennett, Andrew**, Bart Nijssen, and Jessica D. Lundquist. "When and where are multiple snow layers important for simulations of snow accumulation and melt?" Water Resources Research, vol. n/a, n/a, e2020WR028993. https://agupubs.onlinelibrary.wiley.com/doi/pdf/10.1029/2020WR028993, https://doi.org/https://doi.org/10.1029/2020WR028993.

Lumbrazo, Cassie, **Andrew Bennett**, William Currier, Bart Nijssen, and Jessica Lundquist. "Evaluating Multiple Canopy-Snow Unloading Parameterizations in SUMMA With Time-Lapse Photography Characterized by Citizen Scientists". *Water Resources Research*, vol. 58, no. 6, 2022, e2021WR030852. https://doi.org/https://doi.org/10.1029/2021WR030852.

Bennett, Andrew, Adi Stein, Yifan Cheng, Bart Nijssen, and Marketa McGuire. "A process-conditioned and spatially consistent method for reducing systematic biases in modeled streamflow". *Journal of Hydrometeorology*, 2022. https://doi.org/10.1175/JHM-D-21-0174.1.

Beusekom, Ashley E. Van, Lauren E. Hay, **Andrew R. Bennett**, Young-Don Choi, Martyn P. Clark, Jon L. Goodall, Zhiyu Li, Iman Maghami, Bart Nijssen, and Andrew W. Wood. "Hydrologic Model Sensitivity to Temporal Aggregation of Meteorological Forcing Data: a Case Study for the Contiguous USA". *Journal of Hydrometeorology*, 2021. https://doi.org/10.1175/JHM-D-21-0111.1.

**Bennett, Andrew** and Bart Nijssen. "Deep Learned Process Parameterizations Provide Better Representations of Turbulent Heat Fluxes in Hydrologic Models". *Water Resources Research*, vol. 57, no. 5, 2021. https://doi.org/https://doi.org/10.1029/2020WR029328.

Clark, Martyn P., Reza Zolfaghari, Kevin R. Green, Sean Trim, Wouter J. M. Knoben, **Andrew Bennett**, Bart Nijssen, Andrew Ireson, and Raymond J. Spiteri. "The numerical implementation of land models: Problem formulation and laugh tests". *Journal of Hydrometeorology*, 2021. https://doi.org/10.1175/JHM-D-20-0175.1.

Choi, Young-Don, Jonathan L. Goodall, Jeffrey M. Sadler, Anthony M. Castronova, **Andrew Bennett**, et al. "Toward Open and Reproducible Environmental Modeling by Integrating Online Data Repositories, Computational Environments, and Model Application Programming Interfaces". *Environmental Modelling & Software*, 2020.

Nearing, Grey S, Benjamin L Ruddell, **Andrew R Bennett**, Cristina Prieto, and Hoshin V Gupta. "Does Information Theory Provide a New Paradigm for Earth Science? Hypothesis Testing". *Water Resources Research*, vol. 56, no. 2, 2020.

Bennett, Andrew R., Joseph J. Hamman, and Bart Nijssen. "MetSim: A Python package for estimation and disaggregation of meteorological data". *Journal of Open Source Software*, vol. 5, no. 47, 2020. https://doi.org/10.21105/joss.02042.

Lipscomb, William H, Stephen F Price, Matthew J Hoffman, Gunter R Leguy, **Andrew R Bennett**, Sarah L Bradley, Katherine J Evans, Jeremy G Fyke, Joseph H Kennedy, Mauro Perego, et al. "Description and evaluation of the Community Ice Sheet Model (CISM) v2. 1". *Geoscientific Model Development*, vol. 12, no. 1, 2019.

Bennett, Andrew, Bart Nijssen, Gengxin Ou, Martyn Clark, and Grey Nearing. "Quantifying Process Connectivity With Transfer Entropy in Hydrologic Models". *Water Resources Research*, vol. 55, no. 6, 2019. https://doi.org/10.1029/2018WR024555.

Evans, Katherine J, Joseph H Kennedy, Dan Lu, Mary M Forrester, Stephen Price, Jeremy Fyke, **Andrew R Bennett**, Matthew J Hoffman, Irina Tezaur, Charles S Zender, et al. "LIVVkit 2.1: automated and extensible ice sheet model validation". *Geoscientific Model Development*, vol. 12, no. 3, 2019.

Billings, Jay Jay, **Andrew R Bennett**, Jordan Deyton, Kasper Gammeltoft, Jonah Graham, Dasha Gorin, Hari Krishnan, Menghan Li, Alexander J McCaskey, Taylor Patterson, et al. "The eclipse integrated computational environment". *SoftwareX*, vol. 7, 2018.

Kennedy, Joseph H, **Andrew R Bennett**, Katherine J Evans, Stephen Price, Matthew Hoffman, William H Lipscomb, Jeremy Fyke, Lauren Vargo, Adrianna Boghozian, Matthew Norman, et al. "LIVVkit: An extensible, python-based, land ice verification and validation toolkit for ice sheet models". *Journal of Advances in Modeling Earth Systems*, vol. 9, no. 2, 2017.

#### SELECTED CONFERENCE PRESENTATIONS

**Bennett, A.**, B. Horowitz, E. Leonarduzzi, H. Tran, L. Condon, P. Melchior, and R. Maxwell. "Surrogate modeling of the hydrologic cycle to advance on-demand seasonal prediction capabilities across the Continental United States". *AGU Frontiers in Hydrology Meeting*. 2022.

**Bennett, A.** and B. Nijssen. "Informing Machine Learning Models with Hydrologic Theory: A Case Study in Land-Atmosphere Interactions". *AGU Fall Meeting*. 2021.

**Bennett, A.**, M. Bassiouni, and B. Nijssen. "Searching for new physics: Using explainable AI to understand deep learned parameterizations of turbulent heat fluxes".  $AGU\ Fall\ Meeting.\ 2021.$ 

**Bennett, A.** and B. Nijssen. "Searching for new physics: Using explainable AI to understand deep learned parameterizations of turbulent heat fluxes". *EGU General Assembly*. 2021, https://doi.org/https://doi.org/10.5194/egusphere-egu21-3516.

**Bennett, A.** and B. Nijssen. "A coupled approach to incorporating deep learning into process-based hydrologic modeling".  $AGU\ Fall\ Meeting\ 2020.\ 2020,\ https://doi.org/https://doi.org/10.1002/essoar.\ 10504849.1.$ 

**Bennett, A.** and B. Nijssen. "Hard to measure, hard to model: Using information theory to understand turbulent heat fluxes (invited)". *EGU General Assembly 2020*. 2020, https://doi.org/https://doi.org/10.5194/egusphere-egu2020-5957.

Bennett, A., B. Nijssen, Y. Cheng, A. Stein, and M. McGuire. "Post-processing Hydrologic Model Output for Water Resources Studies: A Spatially-consistent, Process-based Correction Method". EGU General Assembly 2020. 2020, https://doi.org/https://doi.org/10.5194/egusphere-egu2020-6036.

Bennett, A., J. Lundquist, J. Hamman, and B. Nijssen. "Leveraging Open Source Platforms to Foster Computational Thinking". *University of Washington Teaching and Learning Symposium*. 2020.

**Bennett, Andrew**, B. Nijssen, and G.S. Nearing. "Dynamic process connectivity for model diagnostics, evaluation, and intercomparison". *AGU Fall Meeting*. 2019.

**Bennett, A.**, B. Nijssen, G.S. Nearing, and M.P. Clark. "A process network based approach to model intercomparison using SUMMA ensembles". *EGU General Assembly*. 2019.

**Bennett**, A., B. Nijssen, G.S. Nearing, and M.P. Clark. "Information theoretic fingerprinting of hydrologic Models". *AGU Fall Meeting*. 2018.

**Bennett, A.**, B. Nijssen, and M.P. Clark. "Fingerprinting hydrologic models by identifying coupling structures". *SIAM Mathematics of Planet Earth*. Invited talk, 2018, Invited talk.

**Bennett, A.**, B. Nijssen, O. Chegwidden, A. Wood, and M.P. Clark. "What Makes Hydrologic Models Differ? Using SUMMA to Systematically Explore Model Uncertainty and Error". *AGU Fall Meeting*. 2017.