# William (Will) Chapman

Website: willychap.github.io Email: wchapman@ucar.edu LinkedIn: William-Chapman-182b41154 GitHub: github.com/willychap

**Research Interests:** Weather and Climate Predictability, Climate Dynamics, Air-Sea interaction, Machine Learning / Deep Learning, Numerical Weather Prediction (NWP), NWP Post-Processing

## EDUCATION

Scripps Institution of Oceanography	La Jolla, Ca			
Ph.D. in Atmospheric Science, Advisors: Dr. Shang-Ping Xie, Dr. Marty Ralph	2021			
Stanford University	Palo Alto, Ca			
M.Sc. in Civil & Environmental Engineering	2016			
University of California San Diego	La Jolla, Ca			
B.Sc. in Environmental Engineering	2012			
PROFESSIONAL APPOINTMENTS				
National Center for Atmospheric Research	Boulder, Co			
Project Scientist I	August 2023-current			
National Center for Atmospheric Research	Boulder, Co			
Post-Doctoral Fellow - Advanced Studies Program *	2022-July 2023			
Multiscale Machine Learning In Coupled Earth System Modeling	Boulder, Co			
Post-Doctoral Scholar *	2022-July 2023			
Scripps Institution of Oceanography	La Jolla, Ca			
Graduate Research Assistant	2016-2021			
National Center for Atmospheric Research	Boulder, Co			
Research Applications Lab - Visiting Graduate Student	2019			
Stanford University	Palo Alto, Ca			
Graduate Research Assistant	2015-2016			
Scripps Institution of Oceanography	La Jolla, Ca			
Undergraduate Research Assistant	2011-2012			
University of California San Diego	La Jolla, Ca			
Interim Assistant Resident Dean - Sixth College	2012, 2016			

\*concurrent

# PUBLICATIONS

- [1] **W. Chapman**, A. C. Subramanian, S.-P. Xie, M. D. Sierks, F. M. Ralph, and Y. Kamae, "Monthly modulations of enso teleconnections: Implications for potential predictability in north america", *Journal of Climate*, pp. 1–71, Mar. 2021.
- [2] W. Chapman, K. Mayer <sup>+</sup>, and M. William, "Exploring the relative importance of the mjo and enso to north pacific subseasonal predictability", *Geophysical Research Letters*, vol. 46, no. 17-18, pp. 10 627–10 635, 2024.
- [3] T. B. Higgins, A. C. Subramanian, **W. Chapman**, D. A. Lavers, and A. C. Winters, "Subseasonal potential predictability of horizontal water vapor transport and precipitation extremes in the north pacific", *Weather and Forecasting*, 2024.

- [4] N. Rampal, S. Hobeichi, P. B. Gibson, J. Baño-Medina, G. Abramowitz, T. Beucler, J. González-Abad,
   W. Chapman, P. Harder, and J. M. Gutiérrez, "Enhancing regional climate downscaling through advances in machine learning", Artificial Intelligence for the Earth Systems, vol. 3, no. 2, p. 230 066, 2024.
- [5] A. Badrinath, L. Delle Monache, N. Hayatbini, **W. Chapman**, F. Cannon, and M. Ralph, "Improving precipitation forecasts with convolutional neural networks", *Weather and Forecasting*, vol. 38, no. 2, pp. 291–306, 2023.
- [6] **W. Chapman** and J. Berner, "Benefits of deterministic and stochastic tendency adjustments in a climate model", *arXiv preprint arXiv:2308.15295*, 2023.
- [7] **W. Chapman** and J. Berner, "Deterministic and stochastic tendency adjustments derived from data assimilation and nudging", *Quarterly Journal of the Royal Meteorological Society*, 2023.
- [8] D. Du, A. Subramanian, W. Han, **W. Chapman**, J. Weiss, and E. Bradley, "Increase in mjo predictability under global warming", *Nature CLimate Change*, 2023.
- [9] T. B. Higgins, A. C. Subramanian, A. Graubner, L. Kapp-Schwoerer, P. A. Watson, S. Sparrow, K. Kashinath, S. Kim, L. Delle Monache, and W. Chapman, "Using deep learning for an analysis of atmospheric rivers in a high-resolution large ensemble climate data set", *Journal of Advances in Modeling Earth Systems*, vol. 15, no. 4, e2022MS003495, 2023.
- [10] W. Hu, M. Ghazvinian, W. Chapman, A. Sengupta, F. M. Ralph, and L. Delle Monache, "Deep learning forecast uncertainty for precipitation over the western united states", *Monthly Weather Review*, vol. 151, no. 6, pp. 1367–1385, 2023.
- [11] F. Schevenhoven, N. Keenlyside, F. Counillon, A. Carrassi, W. Chapman, M. Devilliers, A. Gupta, S. Koseki, F. Selten, M.-L. Shen, et al., "Supermodeling: Improving predictions with an ensemble of interacting models", Bulletin of the American Meteorological Society, 2023.
- [12] W. Chapman, L. Delle Monache, S. Alessandrini, A. C. Subramanian, F. M. Ralph, S.-P. Xie, S. Lerch, and N. Hayatbini, "Probabilistic predictions from deterministic atmospheric river forecasts with deep learning", *Monthly Weather Review*, vol. 150, no. 1, pp. 215–234, 2022.
- [13] S. Michael, P. David, **W. Chapman**, and R. F. Martin, "Seasonally anchored bias correction of cmip5 hydrological simulations", *Authorea Preprints*, 2022.
- [14] P. B. Gibson, W. Chapman, A. Altinok, L. Delle Monache, M. J. DeFlorio, and D. E. Waliser, "Training machine learning models on climate model output yields skillful interpretable seasonal precipitation forecasts", Nature - Communications Earth & Environment, vol. 2, no. 1, p. 159, Aug. 2021, ISSN: 2662-4435.
- [15] S. E. Haupt, W. Chapman, S. V. Adams, C. Kirkwood, J. S. Hosking, N. H. Robinson, S. Lerch, and A. C. Subramanian, "Towards implementing artificial intelligence post-processing in weather and climate: Proposed actions from the oxford 2019 workshop", *Philosophical Transactions of the Royal Society A: Mathematical, Physical and Engineering Sciences*, vol. 379, no. 2194, p. 20200 091, 2021. eprint: https://royalsocietypublishing.org/doi/pdf/10.1098/rsta.2020.0091.
- [16] S. Meech, S. Alessandrini, **W. Chapman**, and L. Delle Monache, "Post-processing rainfall in a high-resolution simulation of the 1994 piedmont flood", *Bulletin of Atmospheric Science and Technology*, Jan. 2021, ISSN: 2662-1509.
- [17] Prabhat, K. Kashinath, M. Mudigonda, S. Kim, L. Kapp-Schwoerer, A. Graubner, E. Karaismailoglu, L. von Kleist, T. Kurth, A. Greiner, A. Mahesh, K. Yang, C. Lewis, J. Chen, A. Lou, S. Chandran, B. Toms, W. Chapman, K. Dagon, C. A. Shields, T. O'Brien, M. Wehner, and W. Collins, "Climatenet: An expert-labeled open dataset and deep learning architecture for enabling high-precision analyses of extreme weather", *Geoscientific Model Development*, vol. 14, no. 1, pp. 107–124, 2021.
- [18] G. Schamberg, **W. Chapman**, S.-P. Xie, and T. P. Coleman, "Direct and indirect effects—an information theoretic perspective", *Entropy*, vol. 22, no. 8, p. 854, 2020.

- [19] A. M. Wilson, W. Chapman, A. Payne, A. M. Ramos, C. Boehm, D. Campos, J. Cordeira, R. Garreaud, I. V. Gorodetskaya, J. J. Rutz, et al., "Training the next generation of researchers in the science and application of atmospheric rivers", Bulletin of the American Meteorological Society, vol. 101, no. 6, E738–E743, 2020.
- [20] W. Chapman, S. E. Haupt, C. Kirkwood, S. Lerch, M. Matsueda, and A. C. Subramanian, "Data from: Towards implementing ai post-processing in weather and climate: Proposed actions from the oxford 2019 workshop", 2019.
- [21] W. Chapman, A. Subramanian, L. Delle Monache, S. Xie, and F. Ralph, "Improving atmospheric river forecasts with machine learning", *Geophysical Research Letters*, vol. 46, no. 17-18, pp. 10 627–10 635, 2019.
- [22] M. Z. Jacobson, M. A. Delucchi, Z. A. Bauer, S. C. Goodman, W. Chapman, M. A. Cameron, C. Bozonnat, L. Chobadi, H. A. Clonts, P. Enevoldsen, et al., "100% clean and renewable wind, water, and sunlight all-sector energy roadmaps for 139 countries of the world", *Joule*, vol. 1, no. 1, pp. 108–121, 2017.

+shared first author

# PUBLICATIONS - IN PROGRESS [Only First Author]

- 1. W., Chapman, J. Berner, "Machine Learning for Online Bias Correction in CAM6", Near Submission, 2024
- 2. W., Chapman, J. Berner, "Online Corrections to the MJO in CAM6", Near Submission, 2024
- 3. **W., Chapman**, J Schreck, D.J. Gagne "WxFormer: Advancing Skill in Medium-Range Global Weather Forecasting through Machine Learning.", *Near Submission*, 2024
- 4. **W., Chapman**, AC Subramanian, SP Xie, T Palmer, A Weisheimer, "Phase-Dependent Forecast Skill of the Madden Julian Oscillation (MJO) Teleconnection in Early and Late Winter.", *In Review, 2024*
- 5. **W., Chapman, K.J. Mayer, W. Manriquez**, "Exploring the Relative Contribution of the MJO and ENSO to Midlatitude Subseasonal Predictability with an Interpretable Neural Network.", *Authorea Preprints, Jan. 2024*
- 6. **W., Chapman**, DJ Gagne, J Schreck, J Berner, "nonLIMear: A Non-Linear Linear Inverse Model for Long-Range ENSO Forecasting", *In Progress, 2022-* github link
- 7. **W., Chapman**, AC subramanian, J Berner, "MJOcast: An Open Access Software Platform for Ensemble MJO Forecast Derivation", *SOFTWARE SUBMISSION*; *In Progress*, 2023- github link,project website

#### PEER-REVIEWED CONFERENCE PAPERS

- 1. Yu, Yang, KR, Moy, **W., Chapman**, PL O'Neill, and R Rajagopal, "Assessing climate change vulnerability of microgrid systems.", 2016 IEEE Power and Energy Society General Meeting (PESGM). IEEE, 2016
- 2. A. Jakubisin, **W. Chapman**, and M. Sierks, "Sustainability and the Student Affairs Professional", *National Association of Student Personnel Administrators Annual Conference, March 2015*

## SELECTED CONFERENCES

- 1. **W Chapman**, "Training Machine Learning Models on Climate Model Output Yields Skillful Interpretable Seasonal Precipitation Forecasts ", 3rd NOAA Workshop on Leveraging AI in Environmental Sciences Sept. 14, 2021 **Highlighted Talk**
- 2. **W Chapman**, "Deep-learning Applications for Environmental Science Artificial Intelligence for Feature Detection", 20th Conference on Artificial Intelligence for Environmental Science AMS 101st Annual Meeting January 2021, 2020 **Session Co-Chair**
- 3. W Chapman, "AI, Ethics, and Inclusion for Geosciences, part 1", 20th Conference on Artificial Intelligence for Environmental Science AMS 101st Annual Meeting January 2021, 2020 Session Co-Chair
- 4. **W Chapman**, L Delle Monache, S Alessandrini, AC Subramanian, N Hayatbini, SP Xie, and FM Ralph, "Probabilistic Weather Prediction with Bayesian Neural Networks", *Machine Learning for Weather and Climate Modeling II AGU Fall Meeting 2020, 2020*
- 5. P Gibson, **W Chapman**, A Altinok, MJ Deflorio, L Delle Monache, and D Waliser, "Interpretable Machine Learning applied to Seasonal Forecasting of Western US Precipitation", *Machine Learning for Weather and Climate Modeling III AGU Fall Meeting 2020, 2020*
- 6. M Sierks, MD Dettinger, **W Chapman**, and M Ralph, "Assessing Vulnerability and Adaptive Management Under Climate Change Scenarios: Lessons from California's Largest Reservoir", *AGU Fall Meeting 2020, 2020*
- 7. **W Chapman**, TJ Kilpatrick, "Machine Learning for inpainting QuikSCAT winds in Hawaii's Lee Region", AI Applied to Airborne or Spaceborne Earth Observation Datasets 100th American Meteorological Society Annual Meeting, January 2020, 2020. AMS Student Presentation Award 1st Place
- 8. **W Chapman**, "Atmospheric River Forecast Model Bias Correction", 19th Conference on Artificial Intelligence for Environmental Science 99th American Meteorological Society Annual Meeting, 2019.
- 9. **W Chapman**, S.-P.Xie, and T.Kilpatrick, "Machine Learning to Improve QuikSCAT Ambiguity Selection Near Hawaii's Big Island", *The International Ocean Vector Science Team Meeting, May 2019.*

#### AWARDS

#### SELECTED INVITED TALKS, TEACHING, & SEMINARS

- 1. **W Chapman**, "Advancing Weather and Climate Prediction with Data-Driven Methods", University of Washington, Allen School Colloquia Series *Feb*, 2024.
- 2. **W Chapman**, "Advancing Weather and Climate Prediction with Data-Driven Methods", Naval Post-Graduate School, *Mar, 2024.*

- 3. W Chapman, "AI/ML Efforts in CESM Using Python", CESM SE Working Group Annual Meeting Mar, 2024.
- 4. **W Chapman** and Kirsten Mayer, "Methods in eXplainable Artificial Intelligence (XAI) + Coding Exercises", UNIDATA users workshop June, 2023.
- 5. **W Chapman**, "Leveraging DART and Nudging Increments to Address Model Bias in CAM6", NOAA Atmosphere-Ocean Processes and Predictability Section March, 2023.
- 6. **W Chapman**, "Monthly Modulations of ENSO teleconnections", NCAR ASP 2022 Workshop on S2S Science and prediction July, 2022.
- 7. **W Chapman**, "AI for Earth and Space Science Workshop at Microsoft ICLR 2022", Atmosphere Session May, 2022. **Organizer**
- 8. **W Chapman**, "Probabilistic Forecasting of Atmospheric River Events with Deep Learning", UCLA Student Seminar Series.-Dec. 03, 2021
- 9. **W Chapman**,"Week 3-6 Prediction of North American Temperature Anomalies in the CESM LENS", 2021 ASP Colloquium The Science of Subseasonal to Seasonal (S2S) Predictions July 12-23, 2021. **Instructor**
- 10. **W Chapman**, "Probabilistic Weather Prediction with Neural Networks", *TRUSTWORTHY ARTIFICIAL INTELLIGENCE FOR ENVIRONMENTAL SCIENCE (TAI4ES) SUMMER SCHOOL July 27, 2021.* Lecture
- 11. **W Chapman**, "Methods for Accurate Uncertainty for Deep Learning Regression Problems", SIO Machine Learners March 16, 2021
- 12. **W Chapman**, "Machine Learing in Python for Environmental Science Problems: Introduction to Machine Learning", AMS committe on Artificial Intelligence Applications to Environmental Science, 20th Conference on Artificial Intelligence for Environmental Science - AMS 101st Annual Meeting - April 2021 **Instructor - Supervised Learning Fundamentals**
- 13. **W Chapman**, L Delle Monache, S Alessandrini, AC Subramanian, N Hayatbini, SP Xie, and FM Ralph, "Deterministic and Probabilistic Methods for Improving Atmospheric River Forecasts with Machine Learning", *Scripps Institutional Seminar November 17, 2020*
- 14. **W Chapman**, "Bayesian Neural Networks and NWP Forecast Post-Processing", UCI/Columbia CBrain Meeting April 21, 2020
- 15. **W Chapman**, "AGU Tutorial on Machine Learning and Deep Learning for the Environmental and Geosciences", AGU Fall Meeting December 08, 2019 **Instructor**
- 16. **W Chapman**, AC Subramanian, L Delle Monache, SP Xie, and FM Ralph, "Spatial Correction of NWP Forecasts", National Center for Atmospheric Research RAL November 7, 2019
- 17. **W Chapman**, T Kilpatrick, and SP Xie, "Comparative Field Reconstruction: Deep Learning, MCA, CCA", National Center for Atmospheric Research Artificial Intelligence Affinity Group (AIAG) Oct 9, 2019
- 18. **W Chapman**, A Wilson, and FM Ralph, "Center for Western Weather and Water Extremes: Atmospheric River Colloquium", Western States Water Council and the California Department of Water Resources Subseasonal to Seasonal Workshop – May 23, 2019
- 19. **W Chapman**, SP Xie, and FM Ralph, "High Impact Weather, Climate Extremes, and Non-Gaussian Statistics", Climate Science Policy Ocean/Atmos Ph.D. Student Seminar February 8, 2019
- 20. **W Chapman**, "No Red Meat or a New Electric Vehicle, Food Choices and Emissions", *Connecting the Dots 2015: The Food, Energy, Water and Climate Nexus*, Stanford University April 17, 2015

# **TEACHING & MENTORING EXPERIENCE**

<ul> <li>Lecture - Climate Variability at The University of Colorado - Boulder Climate Dynamics and Modeling ATOC 4870</li> </ul>	Fall 2022
<ul> <li>SOARS research mentor at The National Center for Atmospheric Research Tony Manriquez (Now B.Sc at CSU) - Significant Opportunities in Atmospheric Rese</li> </ul>	arch Program Summer 2022
<ul> <li>SOARS computational mentor at The National Center for Atmospheric Research Jocelyn Rodriguez (Now B.Sc at UC Davis) - Significant Opportunities in Atmospher</li> </ul>	Summer 2022 ic Research Program
<ul> <li>Intern Program Supervisor at Scripps Institution of Oceanography Center for Western Weather and Water Extremes (12 interns)</li> </ul>	Summer 2020
<ul> <li>Intern Supervisor at Scripps Institution of Oceanography Anirudhan Badrinath (Now M.Sc. Candidate Stanford): Deep Learning NWP Precipit</li> </ul>	2020 tation Post-Processing
• <b>Intern Supervisor</b> at Scripps Institution of Oceanography Laura Thapa (Now Ph.D. Candidate UCLA): Machine Learning for Physics Discovery	2019
• <b>Teaching Assistant</b> at Stanford University Weather and Storms (CEE 263C)	Fall 2015

## **TECHNICAL SKILLS**

•	Languages:	Bash,	Fortran,	LaTex,	Ob	jective	C/	′C++
---	------------	-------	----------	--------	----	---------	----	------

Modeling Tools: NetCDF, CDO, NCO, HPC, Machine Learning, Open MPI
Development Tools: Git/GitHub, Jupyter Suite
Scientific Visualization & Analysis: Python, R, Matlab, Pytorch, Keras, Tensorflow