# Maike Sonnewald, Ph.D.

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## Current position

2/2020-present	Associate Research Scholar: Princeton University, NJ
1/2022-present	Affiliate Assistant Professor: University of Washington, WA
2/2020-present	Affiliate Researcher: NOAA Geophysical Fluid Dynamics Laboratory (GFDL), NJ
8/2022-present	Associate Editor: Journal of Artificial Intelligence for the Earth Systems (American Meteorological Society)

### Education

2011-2016	University of Southampton, UK.			
	Ph.D. Complex Systems Simulation through the National Oceanography Center			
	Dissertation: Ocean model utility dependence on horizontal resolution			
	Advisors: George Nurser, Joel JM. Hirschi, James Dyke			
2006-2011	University of Southampton, UK. M. Sci. magna cum laude, complex systems simulation, 2011 M. Sci. magna cum laude, physical oceanography, 2010			

# Academic positions

2/2019-1/2022	Visiting Scientist: University of Washington, School of Oceanography, Visiting Scientist. Host:
	L. Thompson
10/2015 - 2/2020	Postdoctoral Associate: Massachusetts Institute of Technology (MIT), Earth, Atmosphere
	and Planetary Sciences. Advisor.: C. Wunsch, P. Heimbach & S. Dutkiewicz
2/2017-10/2019	Visiting Scientist: Harvard University, Earth and Planetary Science, Visiting Scientist. Host: C.
	Wunsch
12/2018 - 1/2019	Visiting Scientist: Grenoble Les Alpes, Lab. des Ecoul. Geophysiques et Industriels (Fr), Visiting
	Scientist. Host: T. Penduff & N. Le Bihan
10/2016 - 2/2017	Visiting Scientist: University of Texas at Austin, Inst. for Computational Engineering and
&	Sciences, Visiting Scientist. Host: P. Heimbach
10/2017-10/2018	

# Review articles (total: 2)

- [1] **Sonnewald, M.**, Brajard, J., Duben, P., Lguensat, R. and Balaji, V., *Bridging theory, simulation, and observations of the global ocean using Machine Learning*, 2021, **Environmental Research Letters**.
- [2] Irrgang, C., Boers, N., **Sonnewald, M.**, Elizabeth A. Barnes, Christopher Kadow, Staneva, J., and Saynisch-Wagner, J. Towards neural Earth system modelling by integrating artificial intelligence in Earth system science, 2021, **Nature Machine Intelligence**. DOI: 10.1038/s42256-021-00374-3 https://arxiv.org/abs/2101.09126. Featured on: Carbonbrief, Helmholtz Association of German Research Centers press release, Physics.org, enggtalks and Newsbreak.

# Peer reviewed publications (total: 11)<sup>1</sup>

7 in review/revision, '\*' indicates student advised and press coverage in blue

[3] Clare, M.\*, **Sonnewald, M.**, Lguensat, R., Deshayes, J. and Balaji, V., *Explainable Artificial Intelligence for Bayesian Neural Networks: Towards trustworthy predictions of ocean dynamics*. 2022, **Journal of Advances in Modeling Earth Systems**. Available: ArXiv and ESSOAr

<sup>&</sup>lt;sup>1</sup>Manuscripts in preparation and in revision available at co-authors' discretion.

- [4] Kaiser, B., Saenz, J.A., **Sonnewald, M.** and Livescu, D., *Automated identification of dominant physical processes*, 2022, **Engineering Applications of Artificial Intelligence**. Available: ArXiv
- [5] J. Krasting, M. De Palma, J. Dunne, J. John, and **Sonnewald, M.** Regional Sensitivity Patterns of Arctic Ocean Acidification Revealed With Machine Learning, 2022, **Nature Commun. Earth Environ.** https://doi.org/10.1038/s43247-022-00419-4.
- [6] Sonnewald, M., and Lguensat, R. Revealing the impact of global heating on North Atlantic circulation using transparent machine learning, 2021, Journal of Advances in Modeling Earth Systems. Available: https://agupubs.onlinelibrary.wiley.com/doi/full/10.1029/2021MS002496. Featured on cover, and separately in the "Machine Learning Application to Earth System Modeling" edition.
- [7] Sonnewald, M., and Lguensat, R., Radhakrishnan, A., Sayibou, Z.\*, Wittenberg, A.T. and Balaji, V. Revealing the impact of global warming on climate modes using transparent machine learning and a suite of climate models, 2021, International Conference on Machine Learning: Spotlight paper at ClimateChangeAI Workshop. Available: https://www.climatechange.ai/papers/icml2021/13
- [8] Sonnewald, M., Dutkiewicz, S., Hill, C. and Forget, G. Elucidating Ecological Complexity: Unsupervised Learning determines global marine eco-provinces, 2020, Science Advances. DOI: 10.1126/sciadv.aay4740. Featured on: EOS science news by AGU, MIT News, Hakai Magazine, ECCO story map, The Batch, SciTechDaily, Yahoo! Finance, Dailyhunt, Firstpost and Scienceblog.
- [9] Le Bras, I., **Sonnewald, M.**, and Toole, J.M. A bulk Potential Vorticity budget for the western North Atlantic based on observations, 2019, **Journal of Physical Oceanography**. DOI: 10.1175/JPO-D-19-0111.1.
- [10] Sonnewald, M., Wunsch, C. and Heimbach, P. Unsupervised Learning Reveals Geography of Global Ocean Dynamical Regions, 2019, Journal of Earth and Space Science edition "Geoscience paper of the future". 6. https://doi.org/10.1029/2018EA000519. Featured on: MIT News, Artificial Intelligence Research, Physics.org and ECN magazine.
- [11] Sonnewald, M., C. Wunsch, and P. Heimbach, Linear Predictability: A Sea Surface Height Case Study, 2018, Journal of Climate, 31, 2599–2611, DOI.org/10.1175/JCLI-D-17-0142.1
- [12] Bulczak, A.I., Bacon, S., Naveira Garabato, A.C., Ridout, A., **Sonnewald, M.**, and Laxon, S.W. Seasonal Variability of Sea Surface Height in the Coastal Waters and Deep Basins of the Nordic Seas, 2014, **Geophysical Research Letters**, 42, DOI:10.1002/2014GL061796.
- [13] **Sonnewald, M.**, Hirschi, J.J.-M., Marsh, R., McDonagh, E.L. and King, B.A. Atlantic meridional ocean heat transport at 26N: impact on subtropical ocean heat content variability, 2013, **Ocean Science**, 9, (6), 1057-1069. DOI:10.5194/os-9-1057-2013.
- [14] In review: **Sonnewald, M.**, Reeve, K., Lguensat, R. A supergyre modulates the global overturning through upwelling in the Southern Ocean. In review, **Nature Commun. Earth Environ**.
- [15] In review: **Sonnewald, M.**, A hierarchical ensemble manifold methodology for new knowledge: An application to ocean physics, in review, **JAMES**.
- [16] In review: Navarra, G.G\*, **Sonnewald, M.**, Deng, Y., Liguori, G. and Di Lorenzo, E. *Using Deep Learning to forecast marine fishery indicators in the North Pacific*. In review **Global Change Biology**.
- [17] In review: Jones, D., **Sonnewald, M.**, Rosso, I., Zhou, S., and Boehme, L., *Unsupervised classification identifies co-herent thermohaline structures in the Weddell Gyre*. In review, **Ocean Science**.
- [18] In review: Kaiser, B. and **Sonnewald**, M. Build AI with scientific definitions of interpretability and explainability. In review. Nature Machine Intelligence.
- [19] In review: Bronner, U., **Sonnewald, M.** and Wisbeck, M., *Marine modelling as the key to sustainable use and protection of the marine environment*. Invited contribution to the centennial edition of **The International Hydrographic Review**.
- [20] Submitted: **Sonnewald, M.** A hierarchical ensemble manifold methodology for new knowledge on spatial data: An application to ocean physics. Submitted. **JAMES.**
- [21] In revision: **Sonnewald, M.**, Hirschi, J.J.-M., Nurser, A.G., Firing, Y., Coward, A. and Hyder, P. *Increasing ocean model resolution reveals impact of tuning eddy permitting models*. In revision, **Journal of Advances in Modeling Earth**

#### Systems.

- [22] In revision: Bingham, R. and **Sonnewald, M.** Stable Atlantic overturning circulation revealed by a dynamically-proximate reconstruction. In revision, **Geophysical Research Letters**.
- [-] Upcoming: **Sonnewald, M.**, Lguensat, R., A. Adcroft, V. Balaji and A. Radhakrishna *How Southern Ocean wind gyre circulation buffers global heating in climate models*. In preparation.
- [-] Upcoming: **Sonnewald, M.**, Sayibou, Z., Wittenberg, A.T., Lguensat, R., A. Adcroft, V. Balaji and A. Radhakrishna *Tracking the equatorial undercurrent to understand the El Niño Southern Oscillation mean state in climate models*. In preparation.

### Other publications (total: 3)

- [23] The ECCO Consortium. A Twenty-Year Dynamical Oceanic Climatology: 1994-2013. Part 1: Active Scalar Fields, 2017, MIT DSpace: https://dspace.mit.edu/handle/1721.1/107613.
- [24] The ECCO Consortium. A Twenty-Year Dynamical Oceanic Climatology: 1994-2013. Part 2: Velocities and Property Transports, 2017, MIT DSpace: https://dspace.mit.edu/handle/1721.1/109847.
- [25] Gille, S., Abernathey, A., Chereskin, T., Cornuelle, B., Heimbach, P., Mazloff, M., Menemenlis, D., Rocha, C., Soares, S., Maike Sonnewald, Villas Boas, B., and Wang, J. Open Code Policy for NASA Space Science: A perspective from ocean modeling and ocean data analysis, 2018, NASA White Paper, Available: https://tinyurl.com/NASA-WhitePaper
- [-]Upcoming: Abernathy, R., ... Sonnewald, M., et al., OpenOceanCloud. UN Ocean Decade White Paper.

#### Selected awards and honours

- In review | Principal Investigator: Climate modes determined with Responsible AI for Knowledge, model Evaluation, and observation (CRAKEN). European Research Council Starting Grant €1.6 million.
- In review **Principal Investigator**: Improving coastal sea level predictions with ocean process insight guided by machine learning. To NOAA Climate Program Office \$510,000.
- Pending Principal Investigator: Revealing trophic dynamic provinces in the sea: using unsupervised machine learning to map energy and material fluxes from nutrients to fisheries production. NOAA Climate Program Office \$426,301.
  - 2023 Podcast feature: AGU "Third pod from the sun" and "Carry the two" collaboration.
  - Collaborator: Bridging theory to reality in projections of the Asian and West African monsoons (BRIDGE). National Environmental Research Council (UK). £958,000.
  - Policy impact/advisory role: "Climate and Ocean Variability, Predictability, and Change" program, a core part of the World Climate Research Program by UNESCO and the International Science Council. Invited panel speaker.
  - 2022 Invited working group: Nucleus European Model of the Ocean (NEMO) on machine learning and uncertainty quantification.
  - 2021 Core member: University of California, Santa Barbara, Kavli Institute for Theoretical Physics (KITP), "Machine Learning and the Physics of Climate".
  - 2021 Work featured on cover of JAMES.
  - 2021 **Policy impact/advisory role:** Dept of Energy AI workshop, requested overview talk on 'Ocean Grand Challenges'.
  - 2021 Spotlight paper: International Conference on Machine Learning (ICML).
  - Grant: French National Centre for Scientific Research (CNRS) laboratory collaboration, Mariana Clare. £2000.
  - Policy impact/work featured: NOAA artificial intelligence strategy 2021-2025. Agency wide recommendations.
- 2020-2021 | Grant: Amazon Sustainability Data Initiative (ASDI), \$31,032.
  - 2020 | **Grant:** ASDI, \$48,595
  - 2020 Policy impact: Work contributed to science basis for New Zealand's Marine Protected Area legislation.
- 2018-2020 Grant: Visiting Scientist, Data Institute Univ Grenoble Alpes. €1700.
  - 2017 Award from the Kaufman Teaching Certificate Program (KTCP), MIT.
  - 2016 Physical Oceanography Dissertation Symposium grant, University of Hawaii at Manoa, USA. \$1500.

## Invited conference panels

- 2021 Incorporating Data Science and Open Science in Aquatic Research Summit. Virtual, 624 participants.
- 2020 AGU, Challenges and opportunities of applying AI, ML and DL to problems in the environmental and geosciences. Virtual, ~1200+ participants.
- NOAA Workshop, Leveraging AI in the Environmental Sciences. Virtual, 60+ participants.

# Selected invited talks (total: 61)

Upcoming 2023 U. Toronto (April), European Laboratory for Learning and Intelligent Systems (ELLIS) AI4Good talk, U. Liege (May), Sorbonne University (June).

#### 2022 total: 14

- **CLIVAR** Physical Oceanography review panel.
- NOAA GFDL HQ site review, Discovering and using ocean regimes at GFDL.
- Climate Informatics, Asking how the Southern Ocean responds to global heating and understanding why the answer emerged.
- **SIAM Geoscience**, Understanding the ocean's response in a future climate.
- U. Cambridge, Environmental Data Science Group, Intelligent solutions to monitor ocean health.
- Others SIAM DS, U. Wisconsin-Madison, Max Planck Institute for Meteorology, UC Berkeley, MIT for EAPS and Mechanical Engineering, U. Rhode Island (Nov.), IMSI, U. Chicago.

#### <u>2021</u> Talks total: 14

- AGU, Revealing the impact of climate change on North Atlantic circulation using ML.
- Dept of Energy workshop, Requested topic: Ocean Grand Challenges: Using AI/ML to push the frontiers.
- Climate Change AI, A robust blueprint for trustworthy AI for climate analysis.
- **NOAA**, workshop, Revealing the impact of global warming on climate modes using transparent machine learning and a suite of climate models. Virtual.
- Others KITP, Scripps Institute of Oceanography, U. Washington, U. Chicago, International Conference on Machine Learning, Summit: Incorporating Data Science and Open Science in Aquatic Research, University Corporation for Atmospheric Research (UCAR), U. California, Santa Cruz, GEOMAR Helmholtz Centre for Ocean Research, Technical U. Munich, Potsdam Institute for Climate Impact.
  - 2020 Talks total: 7
    - NOAA Senior Management Meeting, Oceanic and Atmospheric Research. Building geographies of ocean dynamical regimes.
- Others Los Alamos National Laboratory, U. Washington (engineering), U. Washington (phys. oceanography), U. British Columbia, NOAA, workshop, U. Washington (bio. oceanography).
  - 2019 Talks total: 7
    - AGU, The case for machine learning in geoscience. San Francisco, USA.
    - Norway-US bilateral AI workshop, Elucidating Ecological Complexity. Austin, USA.
- Others | Princeton University, Norway-US bilateral AI workshop (on dynamical regimes), WHOI, U. Tromsø, U. Bergen.

#### <u>2012-2018</u> <u>Total talks: 17</u>

- WHOI, Unsupervised learning classifies global ocean dynamical regions.
- Columbia University, LDEO, Linear predictability: A sea surface height case study.
- Yale University, Ocean model utility dependence on horizontal resolution.
- Others MIT (2018 & 2015), Stony Brook University, U. Texas at Austin, U. Washington, Oregon State University, U. Oxford, MIT (Two invited student talks), U. Bristol, NOCS (2015, 2014 & 2013) and MONCACO meeting.

# Selected conference contributions (12 posters and 23 talks) <sup>2</sup>

Upcoming | EGU, The Southern Ocean supergyre: a unifying dynamical framework identified by ML. Talk.

2021 Contributions total: 5

- **AGU**, Elucidating ecological complexity. **Talk**.

EGU, Mechanisms of change in the AMOC under global heating. Highlighted vPICO.

Others | Ocean Science, ICML and Knowledge Guided Machine Learning (KGML).

2020 Contributions total: 3

Climate Informatics, Elucidating Ecological Complexity. Oxford/virtual. Talk.

Others | Climate Informatics and AGU.

2011-2019 Contributions total: 27

- EGU, Unsupervised Learning Reveals Geography of Global Ocean Dynamical Regions. Talk.

- AGU, Unsupervised Learning Reveals Geography of Global Ocean Dynamical Regions. Poster

- World Climate Research Programme (WCRP), Intergovernmental Oceanographic Commission of UNESCO (IOC) Sea Level, Linear predictability: An SSH case study. Poster.

Int. Ass. for the Physical Sciences of the Oceans (IAPSO). Talk, grant recipient.

Others European Geosciences Union (EGU) (2019, 2017, 2015x2, 2012x2), AGU, ECCO meeting(2018, 2017x2), Ocean Science Meeting (2016, 2018), Society of Engineering Science, Physical Oceanography Dissertation Symposium (PODS), SIAM (2015, 2014), Student Conference on Complex Systems (SCCS) (2014, 2013, 2012, 2011), Graduate Climate Conference, ICSS, Ocean Modeling Group and Challenger Conference.

### Mentoring and advising<sup>3</sup>

Upcoming	Advising: William Yik, Harvey-Mud, Holling Scholar (NOAA). Undergraduate.
2021-	Committee member: Jacob Cohen, University of Washington. Ph.D. student.
2021-	Committee member: Yvonne Jenniges, Alfred Wegener Institute (DE), Ph.D. student.
2021	Advising: Mariana Clare, Imperial College London, National Centre for Scientific Research (CNRS,
	Fr), Ph.D. student, now researcher at European Center for Medium Range Weather Forecasting.
2021-2022	Advising: Giangiacomo Navarra, Georgia Tech. Ph.D. student, now postdoc at Princeton.
2021	Advising: Zouberou Sayibou, Bronx Community College, undergraduate, now Junior at Stanford.

# Teaching experience

2019-

2022	Lecture:	University of Washington: "Uses and misuses of machine learning for geoscience", under-
	graduate.	Participants 20. developed material, taught.

- 2021 **Lecture:** Princeton University: "Deep learning in geophysical fluid dynamics", graduate. *Participants 10, developed material, taught.*
- 2021 **Tutorial/workshop:** Society for Industrial and Applied Mathematics (SIAM): Conference on Mathematical and Computational Issues in the Geosciences. Milan, Italy, graduate and undergraduate. *Participants 60, developed material, taught.*
- 2020 Lecture: Oceanhackweek 2020, class size 20, developed material, taught.

Mentoring: Catherine Wilka, now postdoc at Stanford.

- 2020 **Lecture:** GFDL Holling, CIMES and Lapenta interns, undergraduate level: "Machine learning for the goesciences" Class size 6, developed material, taught.
- 2019 **Lecture:** Harvard University EPS: "Machine Learning in Geoscience", graduate. *Class size 10, developed material, taught*
- 2019 **Lecture:** Harvard University Data Science Club: "The good, the bad and the ugly of applied unsupervised learning", graduate and undergraduate. class size 60, developed material, taught.
- Tutorial/workshop (3 day), Princeton University & GFDL workshop at graduate level: "Machine learning and climate modeling", graduate. Class size 20-30, developed material, taught
- 2016 **Lecture:** University of Texas at Austin: "Vertical Mixing Schemes: Why we need them & what they do", graduate. Class size 5, developed material, taught.
- 2014 | Tutorial: SCCS, "Finite differences methods". Class size 40+, developed material, taught.
- 2014 | Tutorial: SCCS "Importance of model validation". Class size 40+, developed material, taught.
- 2013 | **Teaching Assistant**: NOCS, "Physical Oceanography II", undergraduate. Class size 50, held labs.
- 2012 **Teaching Assistant**: NOCS, "MSc Fieldwork Boat Week".
- 2012 | Teaching Assistant: NOCS, "Physical Oceanography I", undergraduate. Class size 50, held labs.

<sup>&</sup>lt;sup>2</sup>Only first author presentations

<sup>&</sup>lt;sup>3</sup>Only formal mentoring and advising listed

### Service

#### Review duties

Journals Nature, JAMES, Geophysical Research Letters, Ocean Modelling, Journal of Geophysical Research,

Journal of Physical Oceanography, Data Science and others.

Review Panel NASA review panel 2017

### Conference, workshop and seminar organization

2023	Climate Informatics,	12th International	Conference on	Climate	In formatics,	Program	Com-
	mittee.						

- 2023 EGU, Machine learning for Earth System modeling, convener.
- 2022 AGU, Interpretable Machine Learning for Marine Sciences, convener.
- 2022 EGU, Machine learning for Earth system modelling, convener.
- 2021 Conference on Neural Information Processing Systems (NeurIPS, Climate Change AI's workshop on 'Tackling Climate Change with Machine Learning', Program Committee.
- 2021 EGU, Machine learning for Earth system modelling, convener.
- 2020 **AGU**, Exploration in observed and model oceanographic data using interpretable ML, oral and poster, **head-convener**.
- 2020 AGU, Machine Learning for Weather and Climate Modeling, oral and poster, convener.
- The 2nd NOAA Workshop on Leveraging AI in Environmental Sciences "Exploiting Space- and Ground-Based Observations and EnhancingEarth System Prediction". Session chair.
- 2020 **EGU**, Machine learning for Earth System modelling, oral and poster, co-convener.
- 2019 OceanObs'19, breakout session, Open Source Software Revolution, co-convener.
- 2019 AGU, Exploration of Observations and Models Using ML, oral and poster, head convener.
- 2015–2016 | MIT Sack Lunch, seminar, organizing member.
  - 2014 SCCS, workshop on "The importance of model validation", organized with Martin Wood.
  - 2014 SCCS, Workshop on "Finite differences methods" organized with Martin Wood.
  - 2014 NOCS Software Carpentry, workshop, single organizer.
  - 2014 | Polar Network Workshop: Science and Society, workshop, organizing member.
- 2014–2015 | **POETS Corner**, seminars **organizing member**.
- 2012–2013 Complex earth system modelling and physical Understanding, seminars, organizer.
- 2011–2013 Rhubarb series, seminars organizing member.
- 2011–2014 | SCCS, conference, organizing member and session convener.

#### Selected diversity, equity and inclusion activities

2021-present	POD member, Unlearning racism in Geoscience (URGE). Program to develop anti-racist
	policies and strategies at Princeton University, POD member.

- 2021 Advising: CIMES internship.
- 2020 Speaker at, Bronx Community College, NYC, USA. Effort by the Bronx Community College STEM Advisory Board to encourage students to consider STEM careers.
- 2017 Leader, Massachusetts Institute of Technology Outing Club. Organization aimed at enabling students and MIT associates of varied cultural and financial backgrounds to access the outdoors by providing leadership expertise and access to gear (such as skies).

#### Selected public engagement and outreach

- 2020 Taught "Climate change 101", Virtual "Summer Climate Camp" by black led SynergyEd. Class size 10, ages 11-13 years, developed material, taught.
- 2019 Nautical day at the MIT museum, MIT Museum, USA.
- 2018 Attendee, US Software Sustainability Institute NSF workshop, Berkeley, USA.
- 2016 Copezilla team, Red Bull Flugtag, Boston, USA. MIT outreach activity.
- 2013 Speaker: Ocean Model fidelity and resolution, ICSS Open Day, Southampton, UK.
- 2012 & 2013 | Speaker: Impact of resolution in ocean models, ICSS Industrial and International Advisory Board meeting, Southampton, UK. Invited talk.
  - 2009 Information tent scientist helper for "Climate Change", United Nations Climate Change Conference (COP 15), Copenhagen, Denmark.