Adrienne Hoarfrost

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Education

PhD in Marine Sciences, University of North Carolina at Chapel Hill. Advisor: Carol Arnosti2018
MS in Marine Sciences, University of North Carolina at Chapel Hill. Advisor: Carol Arnosti2015
AB in Biological Sciences (Geobiology concentration), Dartmouth College2011
<u>Employment</u>
NASA Postdoctoral Fellow, Space Biology, NASA Ames Research Center2021 - present
Scientific Advisor and Co-founder, BlueCarbon (early stage ocean-tech startup)2021 - present
Faculty, ML Lead, Frontier Development Lab 2021 Astronaut Health Challenge2021
Researcher, Frontier Development Lab 2020 Astronaut Health Challenge2020
NASA Postdoctoral Fellow, Astrobiology, Rutgers University
PhD student, University of North Carolina at Chapel Hill
Lab Technician, Harvard University. PI: Peter Girguis2011 - 2012

Publications

Hoarfrost, A., Aptekmann, A., Farfanuk, G. & Bromberg, Y. (*accepted in Nature Communications*), Shedding Light on Microbial Dark Matter with A Universal Language of Life. *Preprint on bioRxiv*: doi:10.1101/2020.12.23.424215.

Sanders, L., Yang, J., Scott, R. T... **Hoarfrost**, A., et al. Beyond Low Earth Orbit: Biological Research, Artificial Intelligence, and Self-Driving Labs. *Invited review in submission at Nature Machine Intelligence. Preprint: arXiv:2112.12582.*

Scott, R. T., Antonsen, E., Sanders, L... **Hoarfrost**, A., et al. Beyond Low Earth Orbit: Precision Space Health, Monitoring, Artificial Intelligence, and Modeling. *Invited review in submission at Nature Machine Intelligence. Preprint: arXiv:2112.12554.*

O'Donoghue, O.*, Duckworth*, P.*, Scheibenreif, L.*, Ughi, G.*, Khezeli, K., **Hoarfrost, A.**, Budd, S., Chia, N., Foley, P., Mackintosh, G., Kalantari, J., Soboczenski, F., Sanders, L. Invariant Risk Minimisation for Cross-Organism Inference: Substituting Mouse Data for Human Data in Human Risk Factor Discovery. *Machine Learning 4 Health at NeurIPS 2021, arXiv:2111.07348 (* indicates equal contribution of the authors)*

O'Donoghue, O.*, Duckworth*, P.*, Scheibenreif, L.*, Ughi, G.*, Khezeli, K., **Hoarfrost, A.**, Budd, S., Chia, N., Foley, P., Mackintosh, G., Kalantari, J., Soboczenski, F., Sanders, L. (*in submission*), Leveraging Invariance in non-i.i.d. Federated Learning.

Budd, S.*, Blaas, A.*, **Hoarfrost, A.***, Khezeli, K.*, D'Silva, K., Soboczenski, F., Mackintosh, G., Chia, N., Kalantari, J. Prototyping CRISP: A Causal Relation and Inference Search Platform. *IEEE LifeTech Proc.*, 2021, pp. 517-521. doi: 10.1109/LifeTech52111.2021.9391819.

ElAbd, H., Bromberg, Y., **Hoarfrost, A.**, Lenz, T.L., Franke, A., Wendorff, M. (2020), Amino Acid Encoding for Deep Learning Applications. *BMC Bioinf.* 21:235, doi: 10.1186/s12859-020-03546-x.

LaRowe, D., Arndt, S., Bradley, J., Estes, E., **Hoarfrost, A.**, Lang, S., Lloyd, K., Mahmoudi, N., Orsi, W., Shah Walter, S., Steen, A., Zhao, L. (2020), The fate of organic carbon in marine sediments – new insights from recent data and analysis. *Ear. Sci. Rev. doi:10.1016/j.earscirev.2020.103146*.

Hoarfrost, A., Nayfach, S., Ladau, J., Yooseph, S., Arnosti, C., Dupont, C. L., Pollard, K. S. (2020), Global ecotypes in the ubiquitous marine SAR86 clade. *ISME Journal.* 14:178-188, doi: 10.1038/s41396-019-0516-7.

Hoarfrost, A., Brown, N., Brown, C.T., Arnosti, C. (2019), Sequencing data discovery with MetaSeek. *Bioinformatics*, *btz499*, *doi:10.1093/bioinformatics/btz499*. Live at http://www.metaseek.cloud/.

Hoarfrost, A., Balmonte, J.P., Ghobrial, S., Ziervogel, K., Bane, J., Gawarkiewicz G., Arnosti, C. (2019), Gulf Stream ring water intrusion on the Mid-Atlantic Bight continental shelf break affects microbially driven carbon cycling. *Front. Mar. Sci.* 6(394), doi:10.3389/fmars.2019.00394.

Balmonte, J.P., Buckley, A., **Hoarfrost, A.**, Ghobrial, S., Ziervogel, K., Teske, A., Arnosti, C. (2018), Community structural differences shape microbial responses to high molecular weight organic matter. *Environ. Microbiol.* 21 (2), 557-571. doi:10.1111/1462-2920.14485.

Hoarfrost, **A.**, and Arnosti, C. (2017), Heterotrophic extracellular enzymatic activities in the Atlantic Ocean follow patterns across spatial and depth regimes, *Front. Mar. Sci.*, 4, 200, doi:10.3389/fmars.2017.00200.

Hoarfrost, A., Snider, R., Arnosti, C. (2017), Improved measurement of extracellular enzymatic activities in subsurface sediments using competitive desorption treatment, *Front. Earth Sci., 5(13)*, 13. doi:10.3389/feart.2017.00013.

Adams, M. M., **Hoarfrost, A.**, Bose, A., Joye, S. B., Girguis P. R. (2013), Anaerobic oxidation of short-chain alkanes in hydrothermal sediments: potential influences on sulfur cycling and microbial diversity, *Front. Microbiol.*, *4*(110), *doi:10.3389/fmicb.2013.00110*.

External Funding

Active funding

NASA Postdoctoral Fellowship

2019

Project Title: Linking Life and Earth with Deep Transfer Learning

Amount Awarded: \$275,869

Role: lead PI

Past Funding

Microsoft AI For Earth Grant

2020

Project Title: The Universal Language of Life – Leveraging Deep Transfer Learning to Model the Biogeosphere

Amount Awarded: \$5000

Role: sole PI

Royster Society of Fellows Dissertation Completion Fellowship 2018 Project Title: Linking Environmental and Microbial Processes from Community to Global Scales Amount Awarded: \$21,000 Role: lead PI Deep Carbon Observatory Deep Life Modeling and Visualization Graduate Fellowship 2016 Project Title: Using Machine Learning to Predict Global-Scale Patterns in Microbial Communities and Carbon-Cycling Activities Amount Awarded: \$27,000 Role: lead PI Center for Dark Energy Biosphere Investigations Graduate Fellowship 2014 Project Title: Investigating Microbial Activities Driving Organic Matter Transformations in the Deep Subsurface Amount Awarded: \$65,000 Role: lead PI Awards & Recognition 1st place Regional, 3rd place Global winner, Mondial de Mer Ocean Hackathon 2021 IEEE LifeTech 2021 Outstanding Paper Award 2021 International Union of Crystallography Travel Award 2018 2016 **UNC Graduate Student Mentor Award** UNC Graduate and Professional Student Federation Travel Award 2013 Richter Memorial Fund Recipient for Independent Research 2010 Barr 1968 Memorial Scholarship for accomplishment in the sciences and performing arts 2009 Selected Professional Development, Service & Outreach Activities Challenge Owner, Mondial de Mer Ocean Hackathon, San Francisco, USA 2021 Subject Matter Expert & moderator, NASA AI for Space Biology Workshop 2021 Subject Matter Expert, NASA Space Apps COVID-19 Challenge 2020 Census of Deep Life Metadata Standards Working Group 2017 - 2018 Next-Generation Sequencing Analysis Workshop, Augusta, MI 2015 Science Advisor for the children's book Where the Wild Microbes Grow 2015 President, Graduate Action Group, UNC-Chapel Hill Dept. of Marine Sciences 2014 - 2015 Deep Carbon Observatory Summer School, Big Sky, MT 2014 Science Judge, Blue Heron Bowl, Raleigh, NC 2014 Senator and Finance Committee member, Graduate and Professional Student 2013 - 2014 Federation Senate, UNC-Chapel Hill **Teaching & Mentorship** Mentor to 4 interns (NASA), 4 undergraduates (Rutgers & UNC) 2013 – present Graduate Teaching Assistant (UNC): Energy Flow in the Environment and Society 2013 Graduate Teaching Assistant (UNC): Marine Physiological Ecology 2013 Graduate Teaching Assistant (UNC): The Marine Environment 2012 Mentor to two high school interns, Harvard University 2011 - 2012

Undergraduate Lab Teaching Assistant (Dartmouth): Genetics

2009

Field Experience

R/V Endeavor, North Atlantic. Effects of organic carbon source on carbon cycling	2016
activities.	
R/V Endeavor, Mid Atlantic Bight. Impacts of ring water intrusions on microbial	2015
enzymatic activities.	
R/V Knorr, South Atlantic. Latitudinal and depth-driven patterns in heterotrophic	2013
functional capacities.	
R/V Atlantis, Juan de Fuca Ridge. Expedition with the Alvin submarine to study	2010
microbial hydrocarbon and sulfur cycling in hydrothermal vent ecosystems.	

Invited Talks

Empowering Al-Driven Insights into Biological Complexity. University of Georgia Athens, Virtual, Feb 2022.

Empowering Al-Driven Insights into Biological Complexity. Rutgers University, Virtual, Sep 2021.

Learning the Biological 'Language of Life': Capturing High Complexity with Limited Data. NASA Artificial Intelligence and Modeling for Space Biology Workshop, Virtual, June 2021.

Empowering Data-Intensive Discovery and Deep Learning-Driven Insights to Capture Biological Complexity in the Biogeosphere. Woods Hole Oceanographic Institution, Virtual, April 2021.

Empowering Al-Driven Insights of Biological Complexity and Open Science for Space Biology. NASA Ames, Virtual, March 2021.

Capturing the complexity of the bio-geosphere with deep transfer learning. NASA Postdoctoral Program Site Visit, Virtual, July 2020.

Capturing the complexity of the bio-geosphere with deep transfer learning. ENIGMA Symposium, Virtual, June 2020.

Modeling the complexity of the bio-geosphere with deep transfer learning. ENIGMA Symposium, New Brunswick, NJ, May 2019.

Linking environmental and microbial processes from community to global scales. Royster Fellow Interdisciplinary Seminar, Chapel Hill, NC, Oct 2018.

From data discovery to data-driven discovery: leveraging sequencing data integration for insights into global microbial biogeography. Rutgers University, New Brunswick, NJ, May 2018.

Data discovery => data-driven discovery. Deep Life Modeling and Visualization Workshop, Tempe, AZ, Mar 2018.

Opportunities and challenges facing deep learning for subsurface microbiology in the era of dataintensive bioinformatics. Microorganisms and Organic Carbon in the Marine Subsurface Workshop, Knoxville, TN, Mar 2018.

Sequence data discovery with MetaSeek. University of California Davis, Davis, CA, July 2017.

Sequence data discovery with MetaSeek. Deep Carbon Observatory Deep Life Community Meeting, Edinburgh, Scotland, Mar 2017.

Global-scale patterns in microbial communities and functions using machine learning. Deep Life Modeling and Visualization Workshop, Ascona, Switzerland, Mar 2016.

Contributed Presentations

Hoarfrost, A., Aptekmann, A., Farfanuk, G., Falkowski, P., Bromberg, Y. *Illuminating the Microbial Dark Matter Driving Energy Transformations in the Environment with a Universal Language of Life*. Goldschmidt Annual Conference, Virtual, July 2021.

Hoarfrost, A., Blaas, A., Budd, S., Khezeli, K., Chia, N., D'Silva, K., Gal, Y., Mackintosh, G., Soboczenski, F., Kalantari, J. *Prototyping CRISP: A Causal Research and Inference Search Platform.* 2021 NASA Human Research Program Investigators' Workshop, Virtual, Feb 2021.

Hoarfrost, A., Bromberg, Y. *The universal language of life – leveraging deep transfer learning to model the biogeosphere.* Goldschmidt Annual Conference, Virtual, June 2020.

Hoarfrost, A., Brown, N., Brown, C.T., Arnosti, C., Bromberg, Y. *Data discovery, integration, and deep learning for the bio-geosphere*. Astrobiology Science Conference, Bellevue, WA, June 2019.

Hoarfrost, A., Brown, N., Brown, C.T., Arnosti, C. Sequencing data discovery and integration with MetaSeek: enabling data-driven discovery linking the biosphere and geosphere. Earth in 4D: Deeptime Data Driven Discovery and the Evolution of Earth Workshop, Washington, DC, June 2018.

Hoarfrost, A., Nayfach, S., Ladau, J., Arnosti, C., Yooseph, S., Dupont, C., Pollard, K. *Predicting global functional and phylogenetic distributions of SAR86*. Ocean Sciences Meeting, Portland, OR, Feb 2018.

Hoarfrost, A., Brown, N., Brown, C.T., Arnosti, C. *Discovery and integration of ocean sequencing data with MetaSeek*. Ocean Sciences Meeting, Portland, OR, Feb 2018.

Hoarfrost, A., Brown, N., Arnosti, C. Sequencing data discovery and integration for Earth system science with MetaSeek. American Geophysical Union Annual Meeting, New Orleans, LA, Dec 2017.

Hoarfrost, A., Brown, N., Brown, C. T., Arnosti, C. *MetaSeek: A sequencing data discovery platform*. Deep Carbon Observatory International Meeting, Edinburgh, Scotland, Mar 2017.

Hoarfrost, A., Balmonte, J.P., Ziervogel, K., Ghobrial, S., Gawarkiewicz, G., Arnosti, C. *Strong effects of a shelfbreak jet on microbial enzyme activities*. Ocean Sciences Meeting, New Orleans, LA, Feb 2016.

Hoarfrost, A., Snider, R., Arnosti, C. *Microbial degradation of organic carbon in the diverse sediments of Guaymas Basin*. American Geophysical Union Annual Meeting, San Francisco, CA, Dec 2015.

Hoarfrost, A., Arnosti, C. *Patterns in heterotrophic extracellular enzymatic activity across geospatial regimes*. Gordon Research Conference on Chemical Oceanography, Holderness, NH, July 2015.

Hoarfrost, A., Arnosti, C. *Microbial extracellular enzymatic hydrolysis of organic carbon along depth and latitudinal gradients in the South Atlantic*. Association for the Sciences of Limnology and Oceanography Annual Meeting, Barcelona, Spain, Feb 2015.

Hoarfrost, A., Couper, L., Arnosti, C. *Pour some sugar on me: extracellular enzymatic hydrolysis of high-molecular-weight polysaccharides in sapropelic and non-sapropelic subsurface sediments.*American Geophysical Union Annual Meeting, San Francisco, CA, Dec 2014.

Hoarfrost, A., Couper, L., Arnosti, C. *Extracellular enzymatic hydrolysis of high-molecular-weight organic carbon in sapropelic and non-sapropelic subsurface sediments*. Center for Dark Energy Biosphere Investigations Annual Meeting, Marina, CA, Oct 2014.

Hoarfrost, A., Couper, L., Arnosti, C. *Investigating microbial activities driving organic matter transformations in the deep subsurface*. Deep Carbon Observatory Summer School, Big Sky, MT, July 2014.

Hoarfrost, A., Arnosti, C. *Investigating microbial activities driving organic matter transformations in the deep subsurface*. Center for Dark Energy Biosphere Investigations Annual Meeting, Marina, CA, Oct 2013.