

"UCI-National Labs Connections"

A Forum connecting UCI faculty and students to research at the National Labs

Climate and Environmental Systems Science @UCI



Climate and Environmental Systems Science @ UCI

Oceans



Wildland fires and terrestrial ecosystems



Arctic systems



Data driven climate science



Theme: Oceans Lead: Kristen Davis



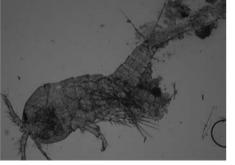
- How is climate change modifying local-toglobal scale ocean circulation patterns, biogeochemistry, and ecosystem processes?
- How will sea level rise influence coastal erosion, flooding, and infrastructure?
- What are the key processes regulating nearshore wave and transport dynamics?
- How do we improve the representation of ocean biogeochemistry in E3SM and other earth system models?

Oceans (Katherine Mackey) Overall Objectives

- How do phytoplankton sense, acclimate, & adapt to environmental stimuli and global change?
- What interplay does adaptation cause within natural populations and with their environment?
- How does the environment drive phytoplankton diversity and biogeochemical activity?

Ongoing studies



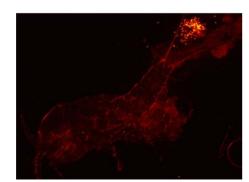


Microbial ecology of the Salton Sea: A dwindling oasis





How do plastics enter marine food webs?





Effect of emissions from the global shipping industry on marine biogeochemistry and phytoplankton ecology





Oceans (Francois Primeau) Overall Objectives

- The ocean's overturning circulation has timescales of hundreds to thousands of years, making it computationally prohibitive to spin-up tracers in global ocean models. Inadequate spin-up makes it difficult to calibrate model parameters using observations. It also leads to spurious climate drifts in Earth System Model.
- We are developing algorithms to accelerate the spin up of ocean tracers in global ocean models.

- DOE-ESMD project in collaboration with Mark Petersen (LANL) to develop algorithms to accelerate the spin-up of marine biogeochemical tracers such as carbon and nutrients in the *E3SM* Earth System Model.
- The approach uses a preconditioned Newton-Krylov algorithm with the preconditioning matrix constructed using impulse response functions in the *MPAS-O* ocean model.





MPAS-O impulse locations

Oceans (J. Keith Moore) Overall Objectives

Develop and apply ESM ocean component models to study climate-biogeochemistry feedbacks and the impacts of climate change on marine ecosystems. Research group members learning to run simulations and write code for the E3SM.

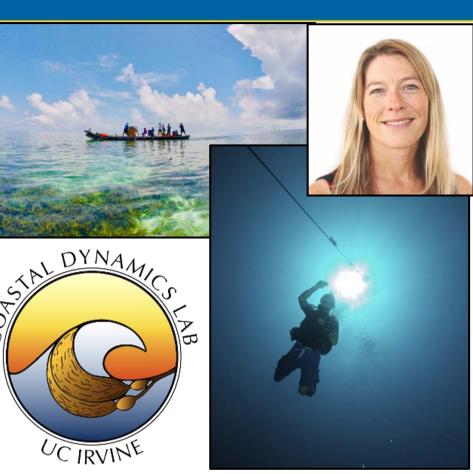
- PI on DOE project, Development of the E3SM Marine Biogeochemistry for Studying Biogeochemistry-Climate Feedbacks, funds development of plankton variable stoichiometry, work on marine methane and nitrous oxide sources, and examines ice sheet impacts on marine biogeochemistry. Mat Maltrud (LANL) is a collaborator, plan additional DOE collaborators for ice sheet work.
- Co-PI on the DOE RGMA funded RUBISCO SFA, focused on potential Climate- Biogeochemistry feedbacks, multiple DOE scientists, Forrest Hoffman (PI, Oak Ridge).
- Co-PI on ESMD grant to Primeau seeking to build model spin up capabilities for the E3SM, several DOE scientists are collaborators including Mark Peterson (LANL).

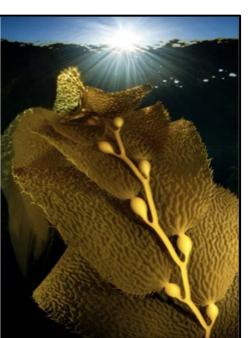


Oceans (Kristen Davis)

Overall Objectives

- In the Coastal Dynamics Laboratory we use field observations and numerical models to understand how physical processes govern circulation in the coastal ocean, its natural variability, and influence on coastal ecosystems.
- Further, we are interested in natural ocean-based strategies for mitigating climate change.





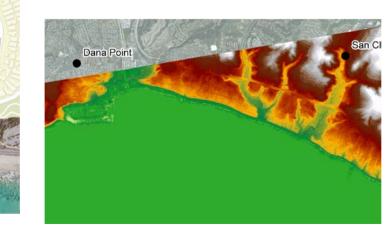
- Dynamics of oceanic internal waves on the inner shelf shoaling, breaking, reflection, refraction, turbulent mixing, and dissipation of energy (NSF/ONR).
- Physical drivers of hypoxia (low oxygen) in shallow coastal embayments (NSF).
- Seaweed farming: Evaluating the potential for offshore cultivation of macroalgae for biofuels and carbon sequestration (DOE/ARPA-E)

Oceans (Brett Sanders) Overall Objectives

- Characterize urban shoreline and beach dynamics over seasonal to multi-decadal time scales.
- Develop remote sensing methods for improved spatial and temporal resolution of shoreline and beach dynamics
- Simulate coastal flood risk

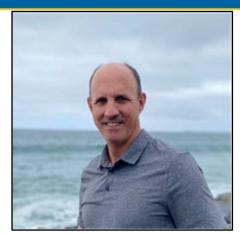
Ongoing Studies

Monthly Drone Surveys of Beach Topography Capture Seasonal Dynamics and Infrastructure Impacts Satellite-based InSAR Monitoring of Beach Topography to Infer Coastal Risks and Sediment Budgets

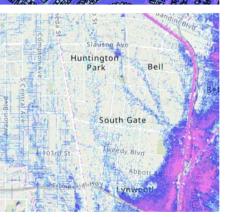


Metropolitan Scale Modeling of Coastal Flood Risks at Fine Resolutions (1-3 m)









Oceans



Kristen Davis faculty.sites.uci.edu/davis/



Brett Sanders <u>floodlab.eng.uci.edu/</u>



Katherine Mackey www.katemackey.com/



Adam Martiny www.ess.uci.edu/group/amartiny/ adam-martiny-lab



Francois Primeau faculty.sites.uci.edu/primeau/



Keith Moore www.ess.uci.edu/~jkmoore/

Theme : Wildland fires and terrestrial ecosystems Lead: Tirtha Banerjee



- How can we improve our measurement and modeling capability for wildfire dynamics to improve prediction?
- What are the key physical processes regulating fireatmosphere interactions?
- How do we design more effective fire and ecosystem management strategies?
- How are terrestrial ecosystems changing and what are the mechanisms responsible for observed trends?
- How do we improve the representation of biogeochemical processes and hydrology in Earth System models?

Wildland fires and terrestrial ecosystems (Tirtha Banerjee) Overall Objectives

- Fluid dynamics of ecosystem-atmosphere interaction.
- Physics of wildland fire behavior.
- Engineering ecosystem management approaches to combat devastating wildfires.

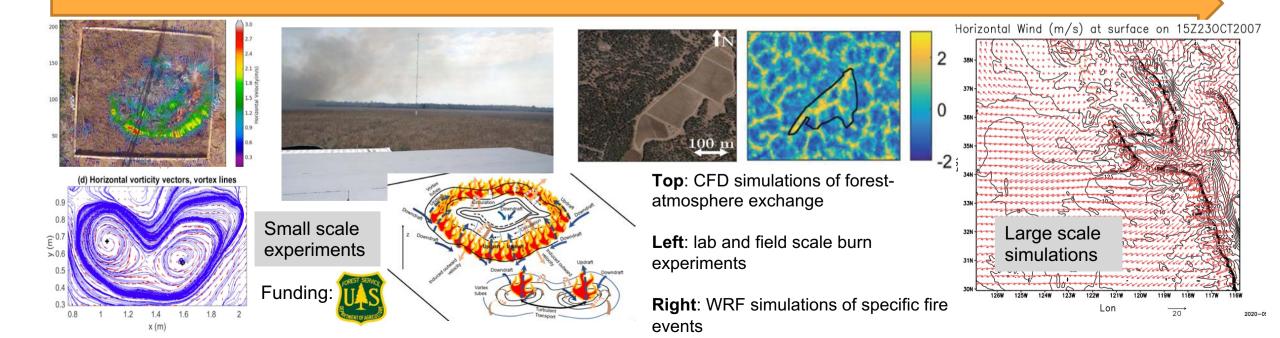
Ongoing studies:

Scales



Banerjee Lab

Boundary Layers and Turbulence (BLT) Research Group, CEE@UCI



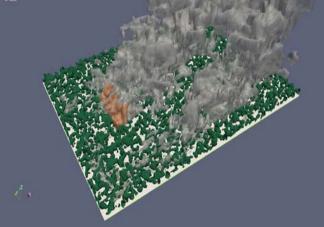
Research projects



Smart Practices and Architectures for Rx Fires

UC Lab Fees Project: Transforming Prescribed Fire Practices for California









An International Network of Networks for the Prediction and Management of Wildland Fires

- Synergy among complementary experiments in different geographical settings
- A standardized protocol to collect, interpret and share data from these experiments,
- (3) The basis of model intercomparisons in the context of multi-fidelity fire modeling,
- (4) A protocol for benchmarking wildfire simulations across multiple scales, and
- (5) A unified training module that adapts the best practices of local knowledge yet can be translated in the international setting.



Other LANL Collaborations: Alex Jonko (WRF modeling), Dubey (UAV, air quality and fires), Satish Karra, Navamita Ray (Quantum computing for CFD)

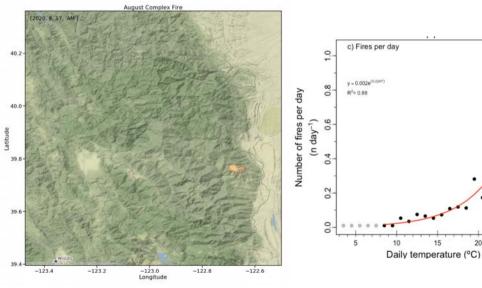
Wildland fires and terrestrial ecosystems (Jim Randerson)

Overall objectives:

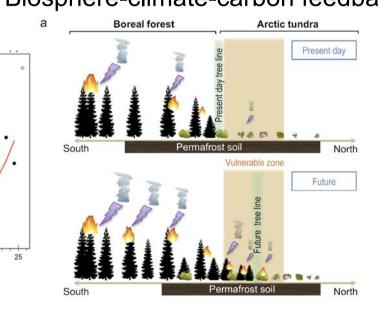
Our lab seeks to improve our understanding of interactions between humans, ecosystems, and climate change that influence the long-term sustainability of the Earth System. To this end, we use satellite data, atmospheric trace gas observations, and earth system models in new ways to study the global biosphere. Ongoing studies:



California wildfires and climate change







C-FIRES satellite concept



UC Lab Fees "California Futures" with Chonggang Xu from LANL

DOE BER RUBISCO Science Focus Area

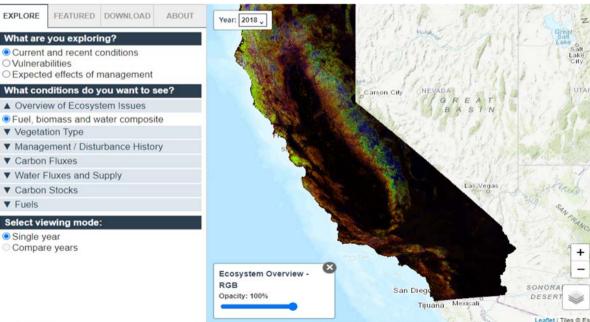
UC Irvine and NASA GSFC

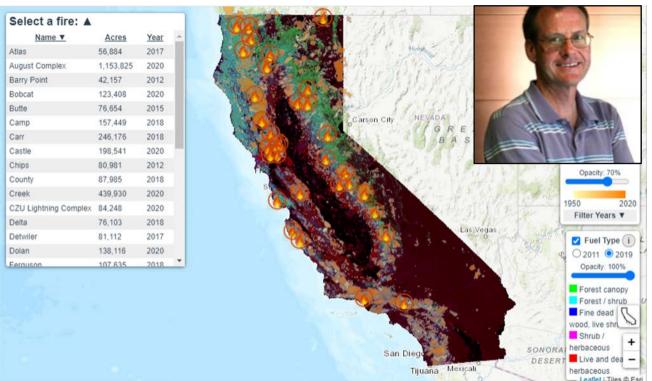
Wildland fires and terrestrial ecosystems (Mike Goulden) Overall Objectives

Understand/address climate/fire/water/carbon/die-off problem

Ongoing:

- \$4.6M Center grant from state
- Based at UCI; appx. 8 institutions, 40 PhDs
- Agency ties (CNRA, CARB, CALFIRE, DWR, etc.)
- Regional collaboratives (NCRP, TCSI, etc)







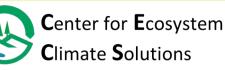














Center for Ecosystem Climate Solutions

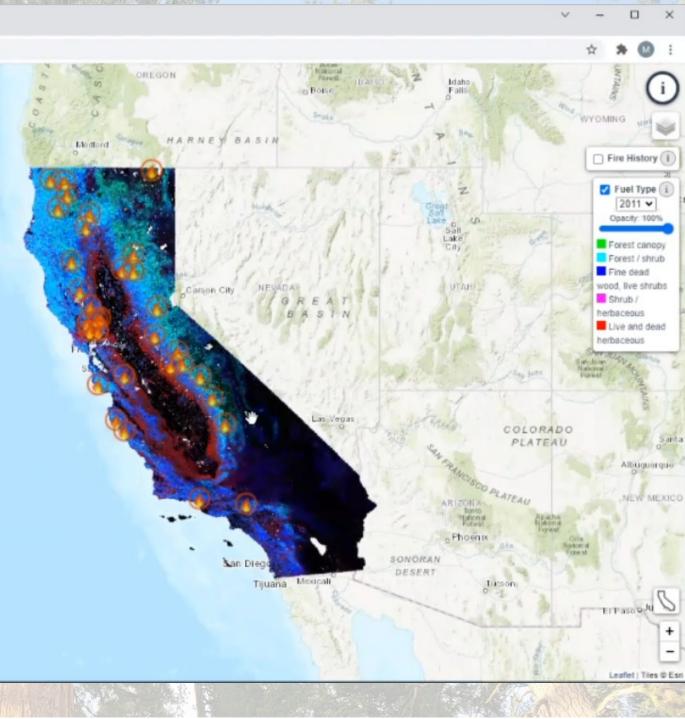
- Actionable geospatial datasets and tools
- Satellite observed fire spread with surface fuels
- Rapid spread along canyon shrub belts (blue areas)
- https://cecs.ess.uci.edu/data -atlas/ https://cecs.ess.uci.edu/fireprogression/ https://cecs.ess.uci.edu/carb on-vulnerability/ https://california-ecosystemclimate.solutions/

Select a fire: A		
Name 🔻	Acres	Year
Atlas	56,884	2017
August Complex	1,153,825	2020
Barry Point	42,157	2012
Bobcat	123,408	2020
Butte	76,654	2015
Camp	157,449	2018
Carr	246,176	2018
Castle	198,541	2020
Chips	80,981	2012
County	87,985	2018
Creek	439,930	2020
CZU Lightning Complex	84,248	2020
Delta	76,103	2018
Detwiler	81,112	2017
Dolan	138,116	2020
Ferguson	107,635	2018
Frying Pan	138,419	2014
Glass	74,686	2020
Hennessey	413,908	2020
King	108,786	2014
North Complex	358,717	2020
Nuns	70,955	2017
Oak	101,200	2017
Ranch	421,850	2018
Red Salmon Complex	157,061	2020

Fire Progression Visualization To: X

+

progression/



Wildland fires and terrestrial ecosystems (Paulo Brando) **Overall Objectives**

- Identify climatic thresholds beyond which wildfires and other disturbances cause major transformations in tropical forest science advances | RESEARCH ARTICLE structure, dynamics, and functions.
- Quantify roles of land use and land cover change in degrading natural ecosystems by altering disturbance regimes, forest resilience

Ongoing studies

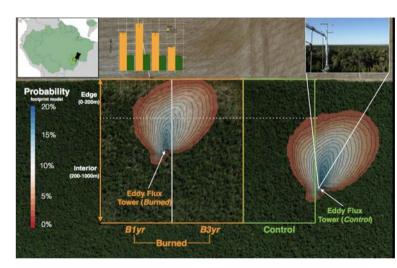
- Legacy effects of compounding disturbances in the Amazon: implications for ecosystem carbon and water cycling (NSF: PI).
- Interactions, feedbacks, carbon consequences of Amazon forest fragmentation incorporating ecosystem structure and thermal dynamics (NASA: PI)
- Incorporating fire and drought dynamics into Earth System Models (CNPq: PI)

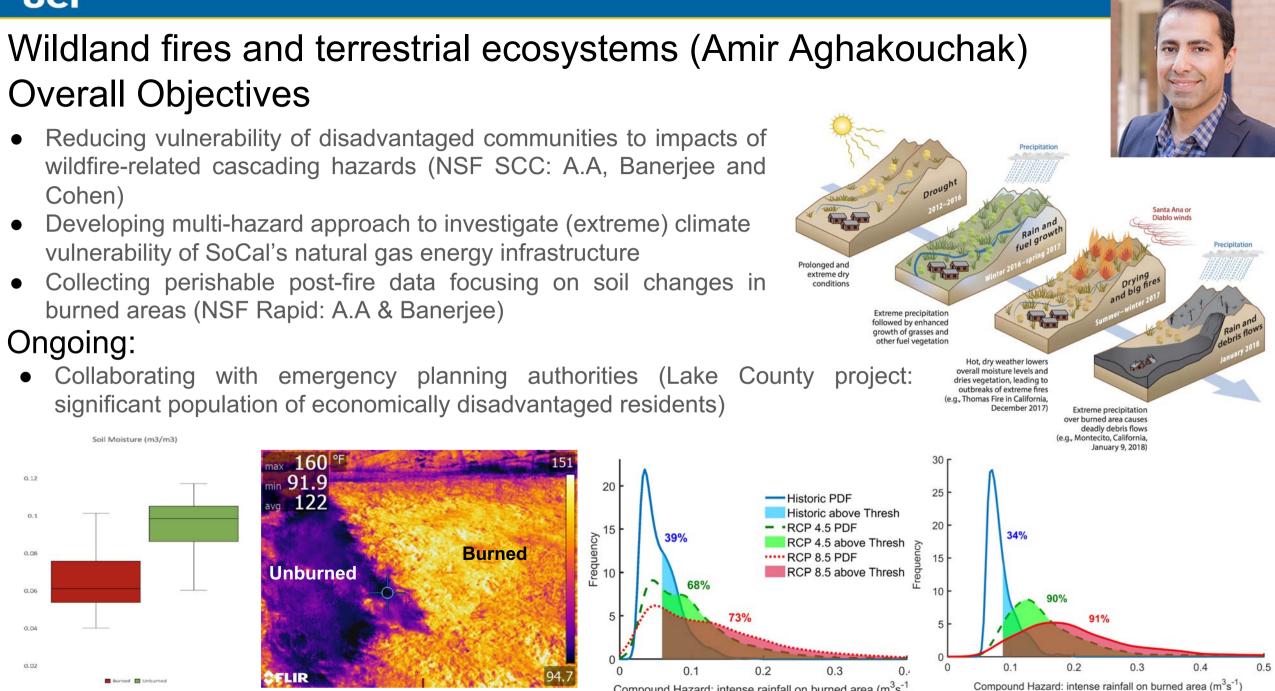




The gathering firestorm in southern Amazonia

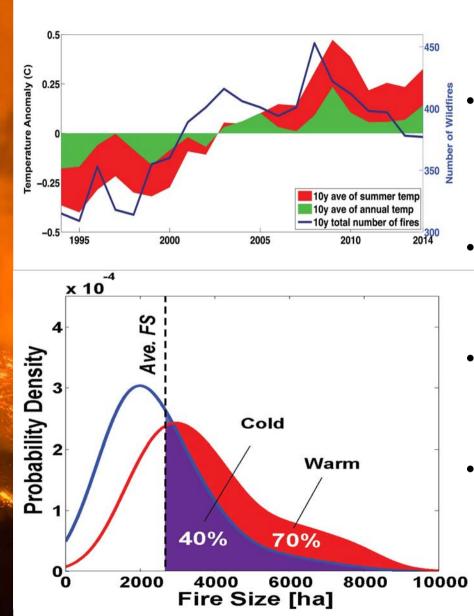
P. M. Brando^{1,2,3}*, B. Soares-Filho⁴, L. Rodrigues⁴, A. Assunção⁴, D. Morton⁵, D. Tuchschneider⁶, E. C. M. Fernandes⁵, M. N. Macedo^{2,3}, U. Oliveira⁴, M. T. Coe^{2,3}





Compound Hazard: intense rainfall on burned area (m³s⁻¹,





Wildfire response to climatic drivers

- Conditionalprobabilitydistribution: annual averagefire-size in cool and warmsummers.
 - Temperature anomalies: Cool summer: -0.5°C Warm summer: +0.5°C
- Shaded: probability of exceeding avg. Californian fire-size.
- Increases by 30% when
 summer temperature
 anomaly increases by 1 °C.
 (Madadgar et al., 2020.)

Wildland fires and terrestrial ecosystems (Efi Foufoula-Georgiou) Overall Objectives

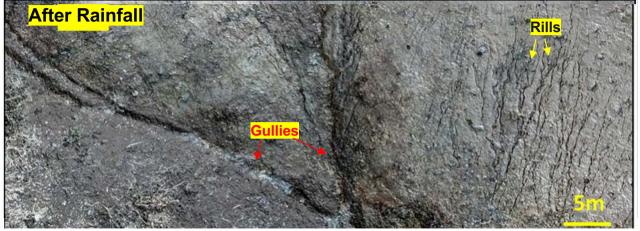


- Stochastic modeling of surface hydrologic and geomorphologic processes.
- Modeling and estimation of space-time rainfall from spaceborne sensors, seasonal precipitation forecasting using observations and climate models
- Stochastic theories of transport on the Earth's surface, river network dynamics and hydrologic response.

- Post-fire disturbance of landscapes -- flood and debris flow hazards
- Dependence on previous post-fire disturbance: Integrate into dynamically-updating hazard prediction framework that accounts for postfire storm cycle dynamics and longer-term antecedent conditions
- How will increasing wildfire frequency affect upland sediment supply?

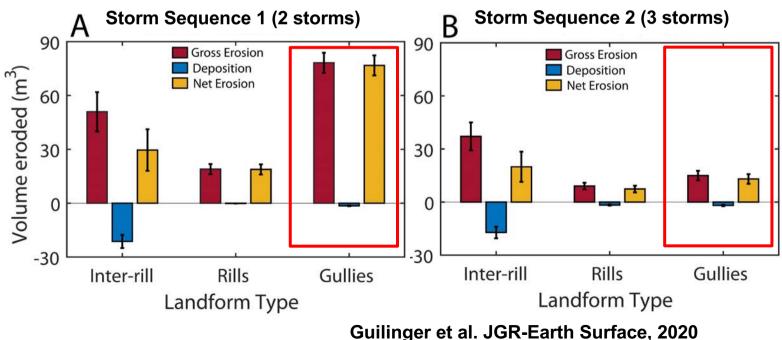
Post-fire disturbance of landscapes -- flood and debris flow hazards

UAV-SfM Imagery: 2018 Holy Fire, Lake Elsinore, CA



How do post-fire upland sediment dynamics change on a storm-to-storm basis during the initial window of disturbance?

- TLS/SfM field monitoring shows <u>supply limitations in</u> <u>channelized (gully) domains</u>, despite only slightly wetter than avg conditions
- Supported by observations <u>of downcutting through long-term</u> <u>fill to bedrock</u> by floods + debris flows





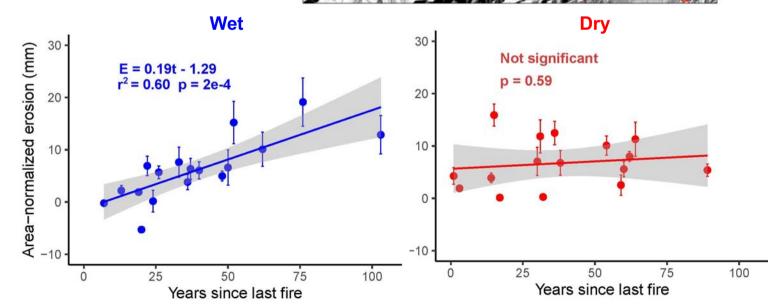
Dependence on previous postfire disturbance

Does previous wildfire disturbance modulate postfire channel sediment supply?

- Use airborne lidar differencing across source headwater catchments (~1-10ha) in 5 burn scars and aggregate erosional responses across fire history (CALFRAP) and associated postfire precipitation indices (PRISM/DRI)
- There is a significant relationship between channel erosion magnitude and time since previous fire in wetter postfire periods (above median) vs drier (below median)

Ongoing work:

Integrate into dynamicallyupdating hazard prediction framework that accounts for postfire storm cycle dynamics and longer-term antecedent conditions



 Yrs since last
 0 - 10

 10-20
 20-29

 30-39
 40-49

 50-59
 60-69

 70-79
 80-89

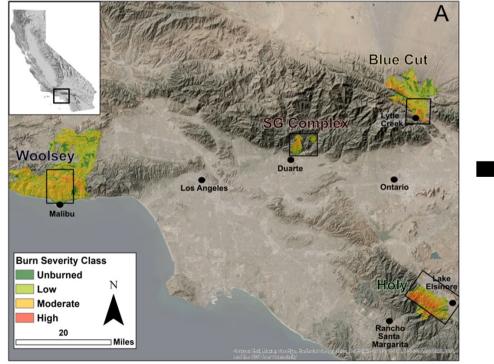
 90-99
 100-104

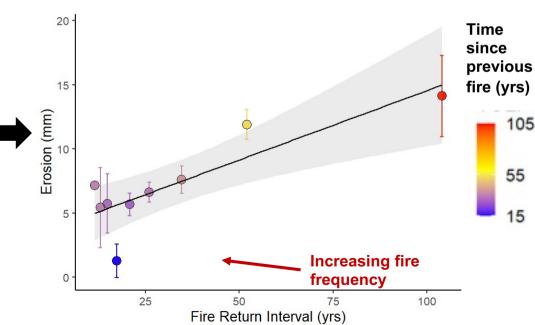
Wildfire frequency impacts on sediment supply

How will increasing wildfire frequency affect upland sediment supply?

- Observations of debris flows fully evacuating channel networks to bedrock
- Used a combination of airborne lidar differencing and historical fire perimeters across four fires that experienced significant erosion to determine dependence of contemporary erosion on previous fire history







Future increases in fire frequency will likely decrease sediment supply

Guilinger et al. 2020; in prep

Wildland fires and terrestrial ecosystems



Tirtha Banerjee <u>faculty.sites.uci.edu/banerjeelab/</u>



Jim Randerson sites.uci.edu/randersonlab/



Mike Goulden faculty.sites.uci.edu/mgoulden/



Paulo Brando ps.uci.edu/node/2126



Amir Aghakouchak amir.eng.uci.edu/





Efi Foufoula-Georgiou efi.eng.uci.edu/

Claudia Czimczik faculty.sites.uci.edu/czimczik/

Theme: Arctic Systems Lead: Claudia Czimczik



- What is the vulnerability of permafrost carbon to climate warming?
- How is climate change impacting the hydrology of the Arctic?
- How are global ice sheets changing and what are the physical processes regulating these dynamics?
- How are vegetation dynamics changing near northern treeline?
- How can we use ice core measurements to study the past composition of the atmosphere and Earth system processes?

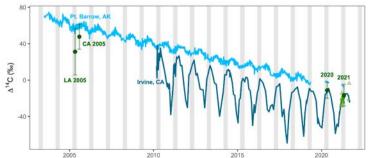
Arctic Systems (Claudia Czimczik)

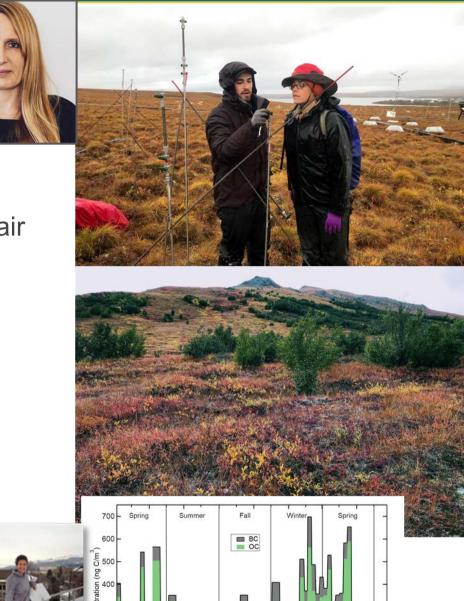
Overall Objectives

The Czimczik Group combines field observation with geochemical analyses to understand how climate change and anthropogenic activities impact C cycling and storage in (Arctic) land ecosystems, air pollution, and the global carbon cycle. Part of KCCAMS.

Ongoing studies

- Sources of winter CO₂ emissions from Arctic tundra (NSF/NASA)
- Impacts of shrub expansion on permafrost thaw (NASA)
- Sources of CO₂/CH₄ emissions from Arctic lakes (NSF/NASA)
- Organic/black C aerosol sources in the Alaskan Arctic (NSF)
- Long-term monitoring of atmospheric ¹⁴CO₂ (NOAA CRN)





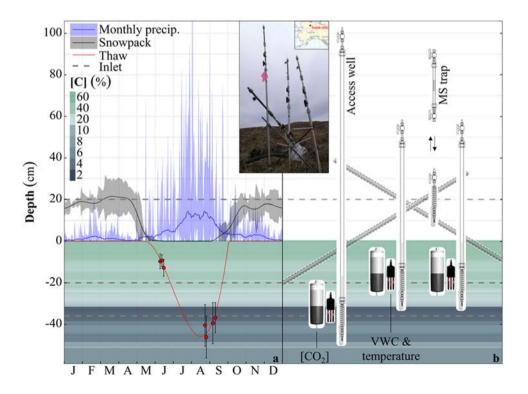
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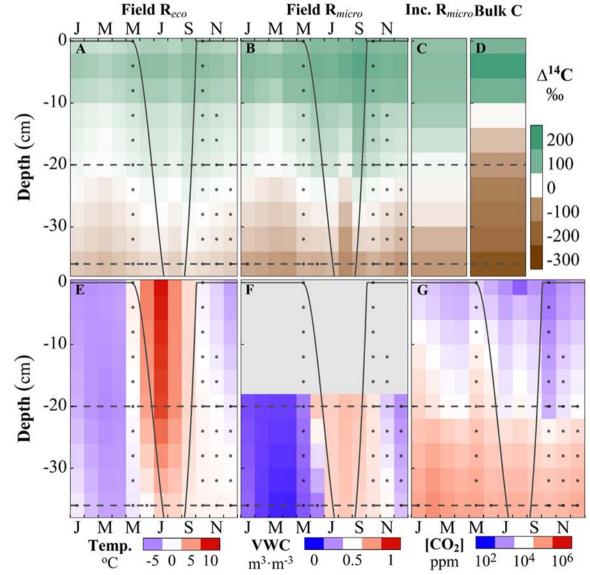
7/14

Sources of winter CO₂ emissions from Arctic tundra

First annual time-series of soil ¹⁴CO₂ reveals:

- Seasonal shift in microbial C sources from fresh plant C during the growing season to older, local soil organic matter through fall, winter, and spring; not captured in standard incubation experiments
- Fall/winter warming is not just accelerating the seasonal break-down of current plant litter, but depleting active layer and permafrost C stocks
- 1st step toward direct monitoring of permafrost C loss



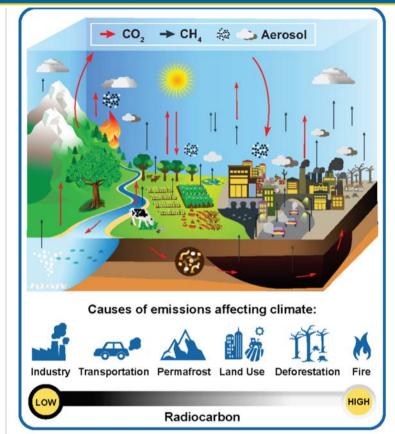


Pedron et al. 2021, Pedron et al. (In Review)

W. M. Keck Carbon Cycle Accelerator Mass Spectrometer Facility (KCCAMS)

Overall Objectives

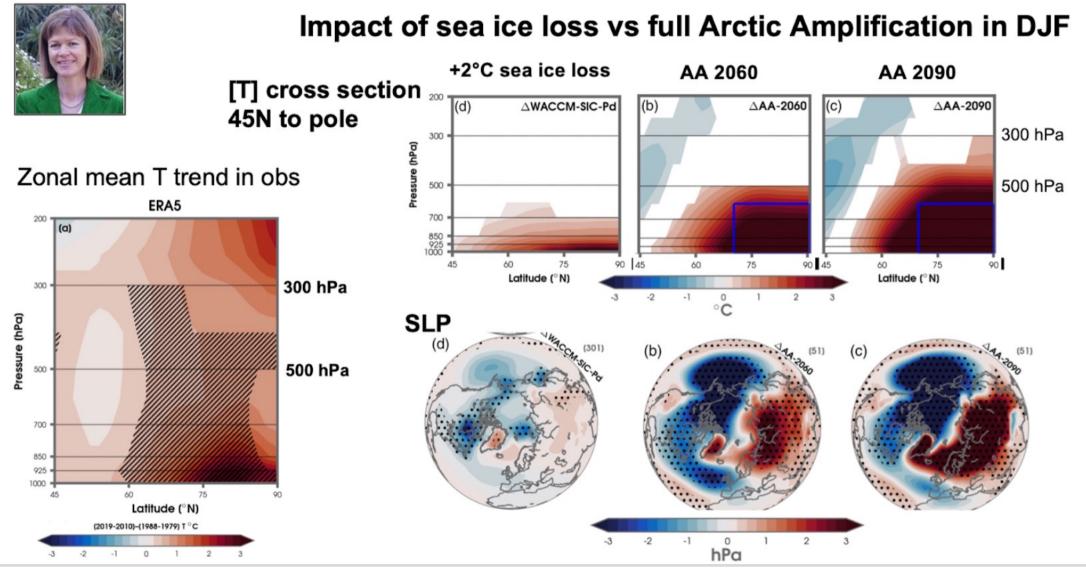
- Radiocarbon (¹⁴C) measurement facility dedicated to supporting carbon cycle research.
- Soon to be upgraded with Mini Carbon Dating System (MICADAS) to support climate change & air quality research



Affiliated Faculty & Staff



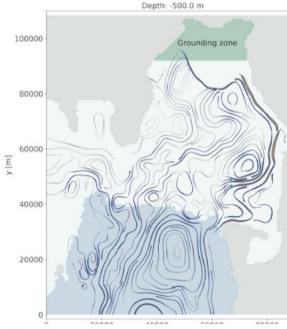
Reducing uncertainty of polar to midlatitude linkages using DOE's E3SM in a coordinated model-experiment setting. PI: Gudrun Magnusdottir (RGMA project, CMIP6 contrib)



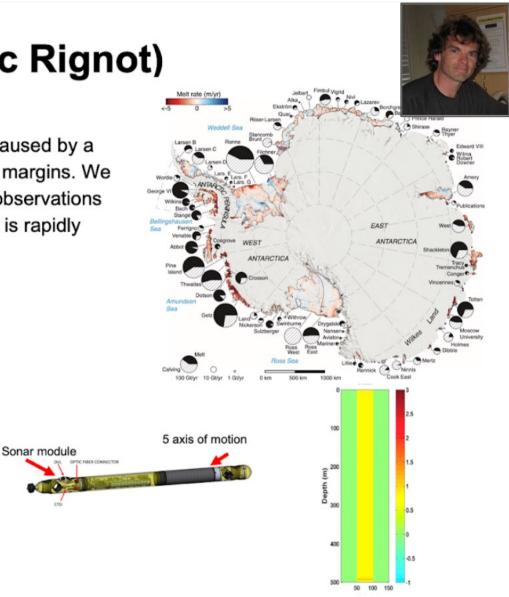
Antarctic and Arctic systems (Eric Rignot)

Research Objectives

Large uncertainties in projection of rapid sea level from Antarctica are caused by a lack of understanding/modeling of ice ocean interaction along ice sheet margins. We use couple ice-ocean numerical modeling, remote sensing and in situ observations of ice melt and grounding zone dynamics to study how a warmer ocean is rapidly eroding the Antarctic Ice Sheet away.



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Simulation of ocean circulation in cavities

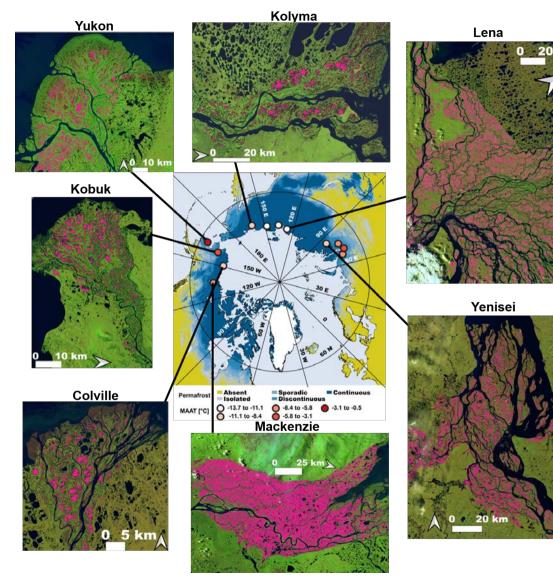
Simulation of ocean circulation at 1 m resolution

Arctic Systems (Efi Foufoula-Georgiou,) Overall Objectives

- Stochastic modeling of surface hydrologic and geomorphologic processes.
- Modeling and estimation of space-time rainfall from spaceborne sensors, seasonal precipitation forecasting using observations and climate models
- Stochastic theories of transport on the Earth's surface, river network dynamics and hydrologic response.
- Ongoing studies
- Investigate how thaw lake coverage on arctic deltas respond to climate change



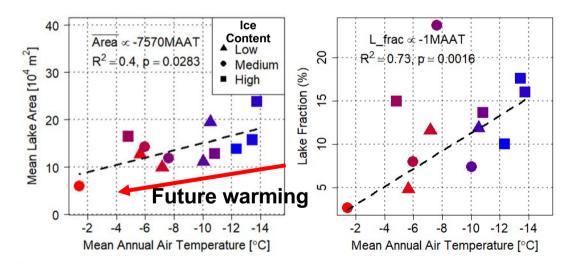
How will thaw lake coverage on arctic deltas respond to climate change?



Ice rich permafrost on arctic deltas leads to the formation of thaw lakes.

Thaw lakes modulate nutrient (C, N, etc.) and sediment delivery to the Arctic Ocean.

Projected SLR, changing hydrology, and permafrost thaw are expected to lead to complex lake cover changes.

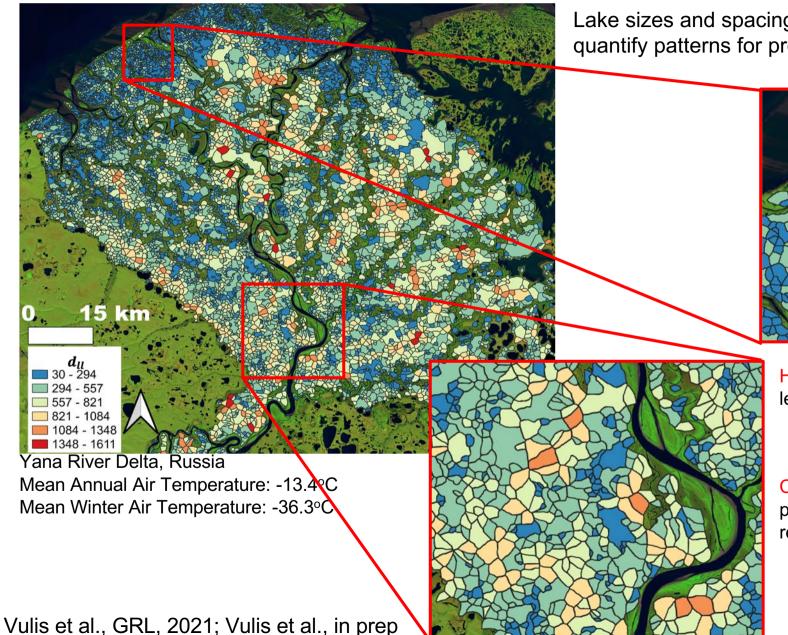


Relevant to DOE's: InteRFACE Interdisciplinary Research for Arctic Coastal Environments

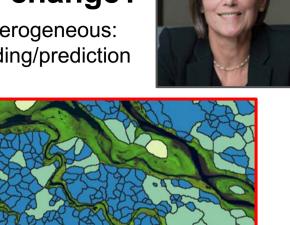
UCI PI: Foufoula-Georgiou, LANL: Rowland

Funding: UC Lab Fees In-Residence Graduate Fellowship @ LANL

How will thaw lake coverage on arctic deltas respond to climate change?



Lake sizes and spacing are spatially heterogeneous: quantify patterns for process understanding/prediction



Highly packed coastal areas more vulnerable to sea level rise than permafrost thaw

Coarsely packed upper delta is at low risk of permafrost thaw, lake development, and carbon release

Arctic Systems



Claudia Czimczik faculty.sites.uci.edu/czimczik/



Gudrun Magnusdottir www.ess.uci.edu/group/gudrun/home



Efi Foufoula-Georgiou efi.eng.uci.edu/



Isabella Velicogna www.ess.uci.edu/~velicogna/pi.html



Eric Rignot <u>faculty.sites.uci.edu/erignot/</u>



Eric Saltzman sites.uci.edu/saltzman/eric-saltzman/

Theme: Data-driven climate science Lead: Jim Randerson



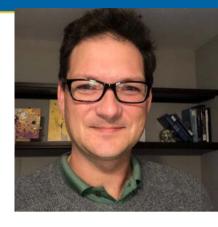
- How do we improve the representation of clouds and other physical and biogeochemical processes in earth system models using machine learning?
- How can we use new machine learning approaches and climate observations together to improve the predictability of the Earth system?
- What are the most effective ways to decarbonize our energy systems?

Data-Driven Climate Science (Mike Pritchard) Overall Objectives:

- Add explicit low cloud and boundary layer turbulence feedbacks to global models.
- Outsource hi-res physics to neural network (NN) emulators, bypass Moore's law.
- Enforce physical constraints, develop algorithms for reliable NN emulators
- Make software to bridge the Fortran-python (ML) divide to test NNs inside GCMs.

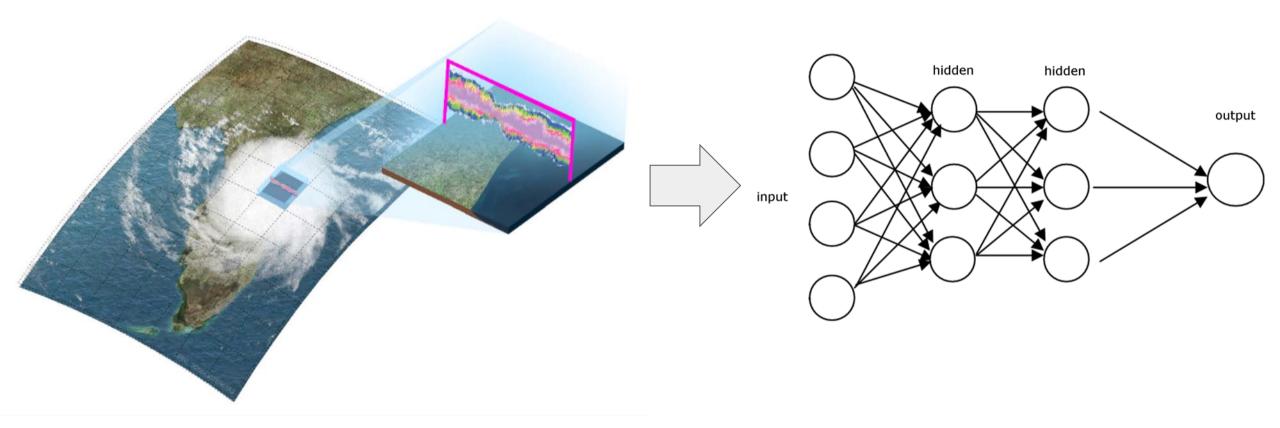
Ongoing studies:

- Explore unsupervised ML compression methods to summarize stable clusters of coherent turbulent structures in overwhelming hi-res global model output.
- Thus reveal the "latent space of turbulence + microphysics + radiation"
- Bayesian Hierarchical Variational Autoencoders for generative parameterization.



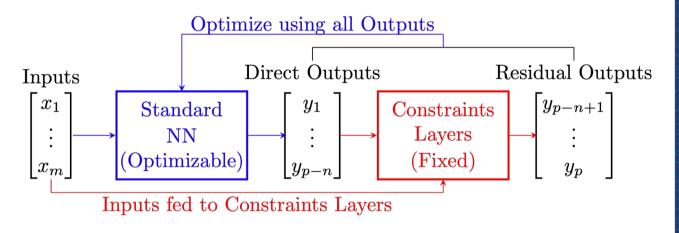
UCI

Deep learning to represent sub-grid processes in climate models.

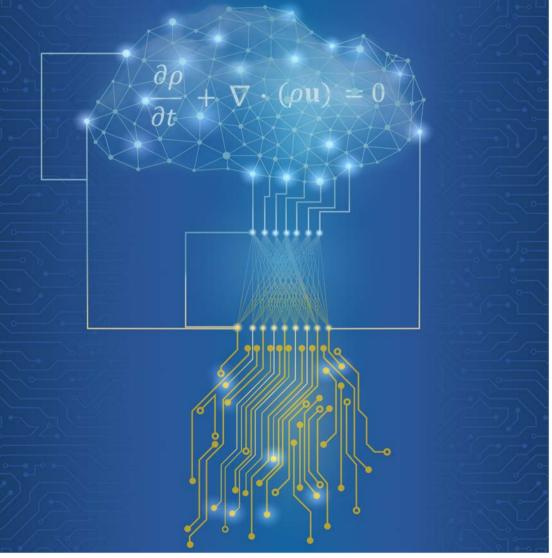


Rasp, Pritchard and Gentine, PNAS, 2018 (> 300 citations)

Enforcing analytic constraints in neural network emulators of physical systems.



Beucler, <u>Pritchard</u> et al., *Physical ReviewLetters* 2021 (APS Editor's spotlight).> 50 citations.



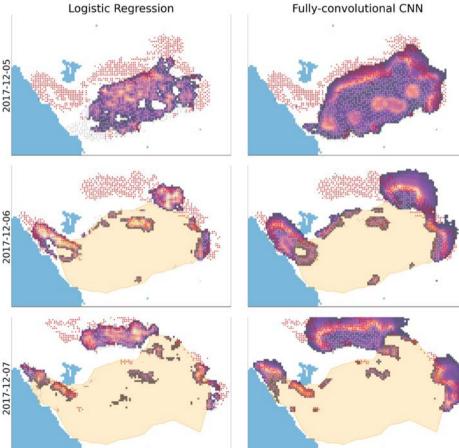
Data-Driven Climate Science (Padhraic Smyth)

Overall objectives:

Develop and apply new machine learning approaches for climate science

Ongoing and recent studies:

- Forecasting daily wildfire spread with convolutional neural networks
- Forecasting daily wildfire activity using Poisson regression
- Machine learning to predict final fire size at the time of ignition





Data-driven climate science



Mike Pritchard <u>sites.ps.uci.edu/pritchard/</u>



Amir Aghakouchak amir.eng.uci.edu/



Padhraic Smyth www.ics.uci.edu/~smyth/index. html



Steve Davis www.ess.uci.edu/~sjdavis/

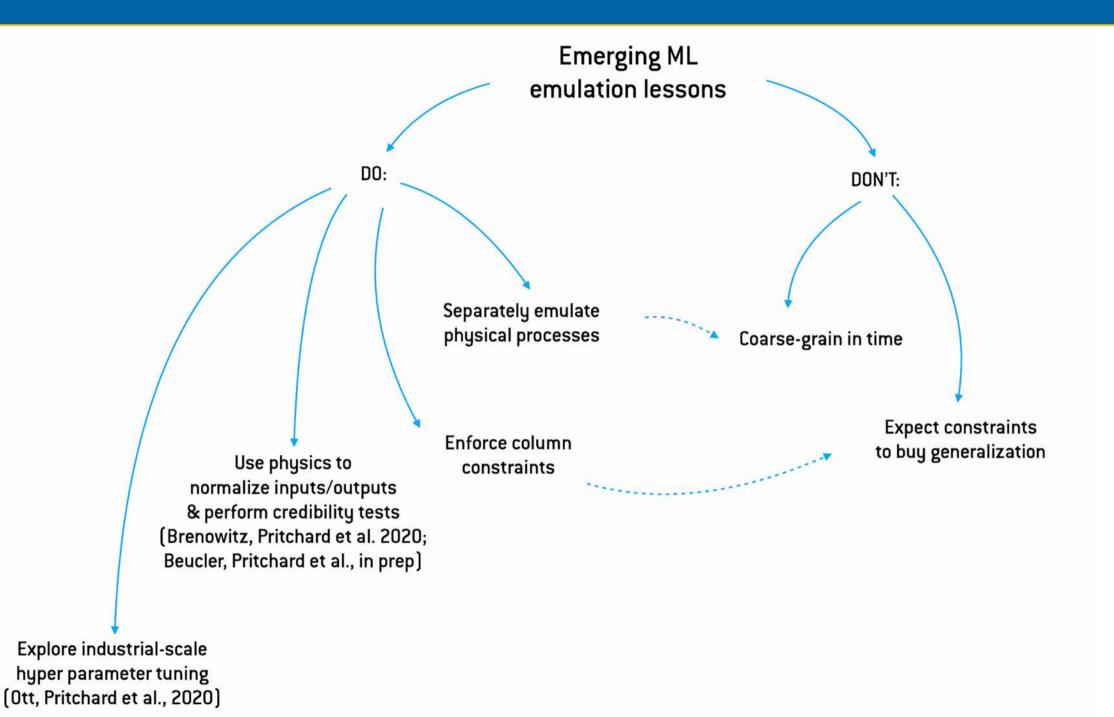


Jin-Yi Yu https://www.ess.uci.edu/~yu/



Jasper Vrugt https://faculty.sites.uci.edu/jasper/

Backup Slides



LLNL / ORNL / Sandia / Pritchard Collab:

Sole University Partner in DOE Exascale Computing Project (PIs: Taylor, Bader)

Overall Objectives

- Port high-fidelity cloud-resolving calculations to GPU in order to: Run unprecedented simulations of multi-scale global climate on Summit/Aurora.
- Augment physics of embedded convection with major algorithmic refinements.

- Exploit these data for ever more ambitious NN emulators of sub-grid climate physics.
- Use VAE-haloing techniques to hedge against out of sample extrapolation (new BNL collab)

PNNL / Pritchard Collab:

Overall Objectives

- Refine a new parcel model trained neural network emulator of aerosol activation.
- Cut cost of high-fidelity kinetics-based benchmarks of aerosol-cloud interaction (ACI)
- Exploit UCI "Fortran-Keras Bridge" software to test within E3SM climate model.
- What is the effect of adding these missing physics on overall global ACI?
 Ongoing studies
 - Test limits of semi-automated brute-force hyperparameter tuning to optimize fit.
 - Industrial-scale architecture searches for improved NN fits.

ENABLING AEROSOL-CLOUD INTERACTIONS AT GLOBAL CONVECTION-PERMITTING SCALES (EAGLES)

New ASCR SCM award spanning UCSD / UCI / Columbia Re: ML for scientific discovery

Lead PI: Rose Yu (UCSD)

UCI partners: Mandt (ICS)

and Pritchard (ESS)

