

# **Junior Chair in Data Science for Earth, Space and Environmental Sciences, MEOM Team, IGE**

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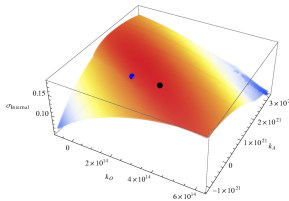
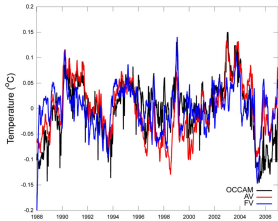
**Maike Sonnewald**

Massachusetts Institute of Technology, visitor Harvard

## **Background and research vision**

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# Background: National Oceanography Centre & Institute for Complex Systems Simulation



**Masters: NOCS&ICSS**

1 paper

9 invited talks & conference contributions

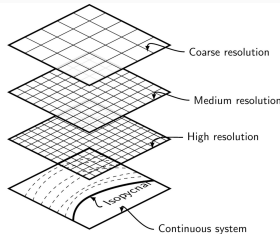
Awards

## PhD: Ocean model utility

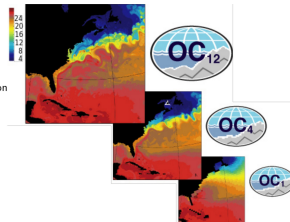
1 published and 3 papers in prep

20 invited talks & conference contributions

Numerous awards



[noc.soton.ac.uk/JRD/OCCAM/OC12](http://noc.soton.ac.uk/JRD/OCCAM/OC12)



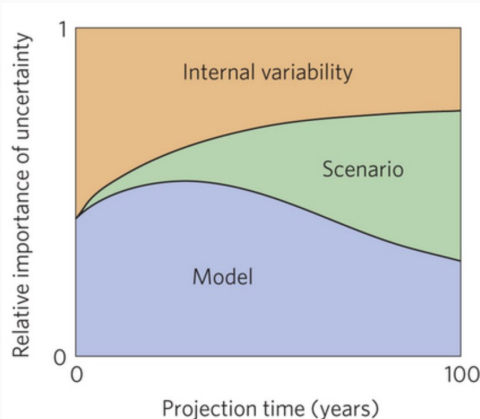
Prof. Carl Wunsch and Prof. Patrick Heimbach on ECCO  
adjoint State Estimate project

Interface of ocean theory and advanced analytical methods

# PostDoc at MIT: Uncertainty and predictability

Prof. Carl Wunsch and Prof. Patrick Heimbach on ECCO  
adjoint State Estimate project

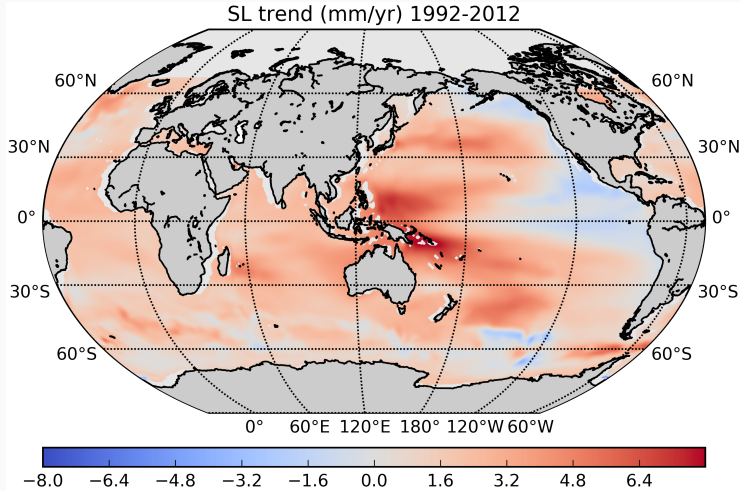
Interface of ocean theory and advanced analytical methods



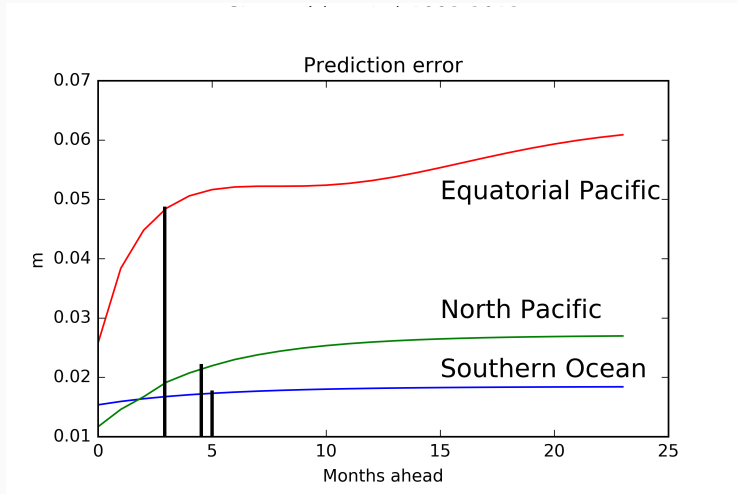
Yin, 2015

- Global and local dynamical balances
- Statistics and predictability of sea level
- Uncertainty quantification using Lagrangian Coherent Structures

# Linear Predictability of Sea Level: Statistical applications

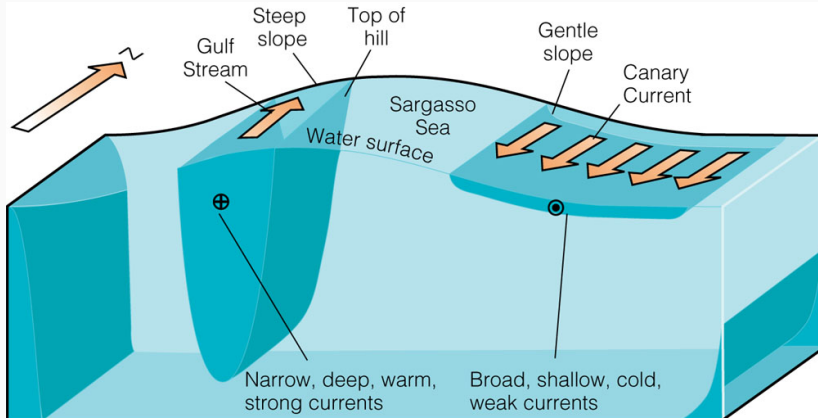


# Linear Predictability of Sea Level: Statistical applications



Paper in review, 3 invited talks and 1 conference contribution

# What dynamics dominate: Theoretical expertise



© 2005 Brooks/Cole - Thomson

## Momentum balance:

Use adjoint sensitivities to have data-constrained error-bars



## Research vision: Probabilistic Oceanography

- Exciting time: Vast quantities of data from observations and models offer insight
- Modern oceanography; need for new tools
- Data science is interface!

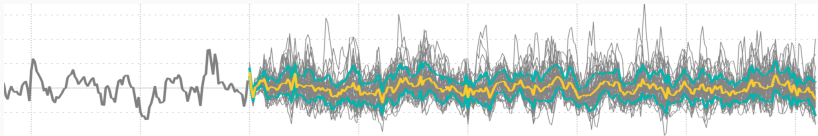
# Research vision: Probabilistic Oceanography

- Exciting time: Vast quantities of data from observations and models offer insight
- Modern oceanography; need for new tools
- Data science is interface!

## Paradigm shift unavoidable

Well posed scientific questions → Probabilistic Oceanography

Meet societal needs

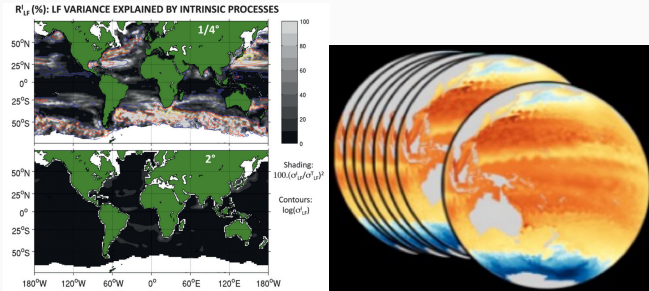


<https://meom-group.github.io/>

## Proposed project

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# Ocean models as probabilistic tools: OCCIPUT project at MEOM IGE



Penduff *et al.*, 2011

**OCCIPUT**: 50 member ensemble, 56 yr, high res. global model

Climate-relevant water mass var.  $\leftrightarrow$  turbulence-driven **chaos**

**Systemic view**: Characterize and understand along water pathways

# Reduce 100TB dataset: Lagrangian particle trajectories

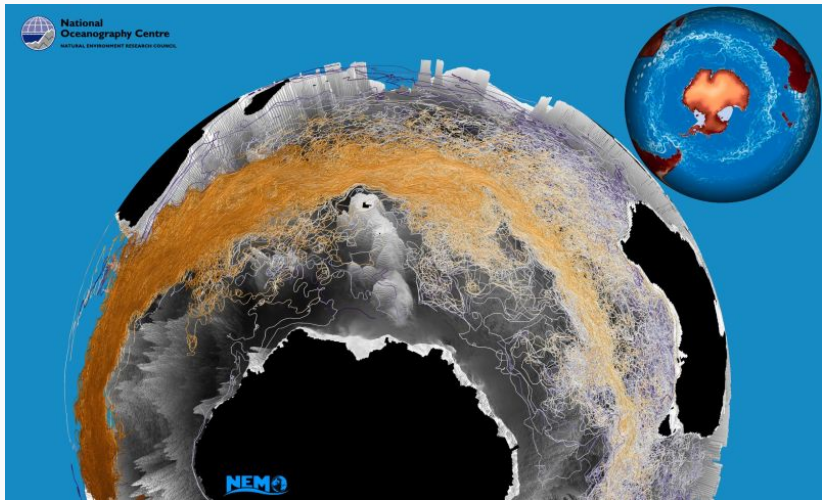
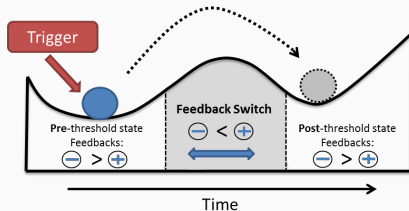


Image credit: Andrew Coward

# Describe stable states: PDFs



Briske et al. 2006

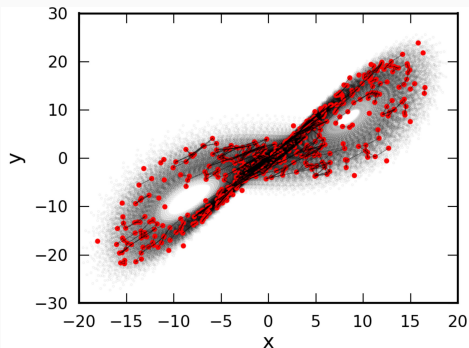
- *Shannon's theory* informs us how **likely** a trajectory is:
  - Spatially oriented PDFs highlight key transitions
- Visibility graphs:
  - Unsupervised clustering: Can we see **common properties** between state transitions?

## Result: Original classification

Deliver novel classification with probabilistic insight from  
information theory

# Understanding mechanisms of member divergence

- Recurrence network analysis:
  - Chaotic or regular? Assortativity to characterize geometrical properties
  - Ocean transport associated with mechanisms?
- Assess likelihood of cascades of causality
  - Identify priors
  - Associate likelihood



Donges *et al.*, 2015

## Novel approach

Key insights into dynamics of intrinsic var. key to climate projections

# Université Grenoble Alpes: How I will work in ocean team

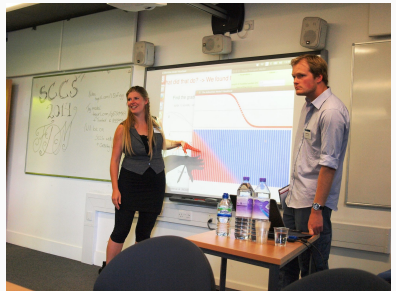
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# Institute connections and social vision

## Experience

- Taught/organised numerous workshops, conference sessions
- Hosted interdisciplinary seminars at ICSS, NOCS, MIT and UT
- Collaborate with GIPSA-lab (mentoring)
- Seminars and events:
  - Help develop common language to collaborate
  - Overcome interdisciplinary barriers
  - Gather communities
- Teaching and mentoring
- Organize workshop



# Software development: Global contributions and collaboration

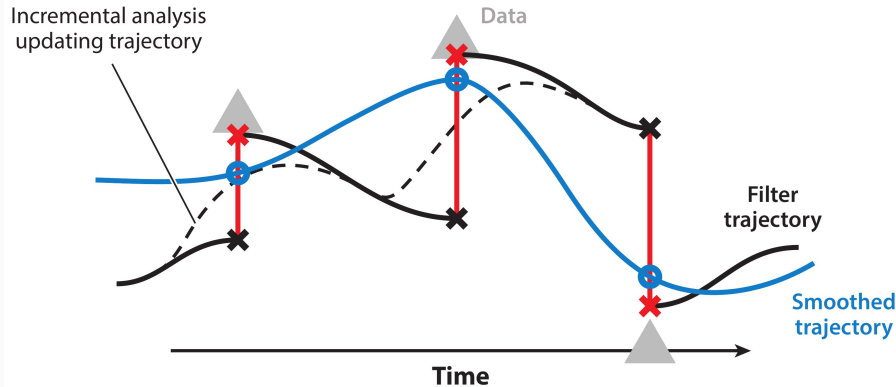


- Make data available to wider **community**
- Université Grenoble Alpes on the map for oceanographic software development
- **Contribute** code:
  - Pyunicorn and Pangeo (xarray)
- Promote good coding practices:
  - Software carpentry, hackathons

Thank you for your attention

Questions?

# ECCO state estimate: Supervised inverse problems



Stammer *et al.* 2016

## Model uncertainty

ECCO gives us an Ocean State consistent with known physics and data