



Systematic Assessment of Terrestrial Biogeochemistry in Earth System Models

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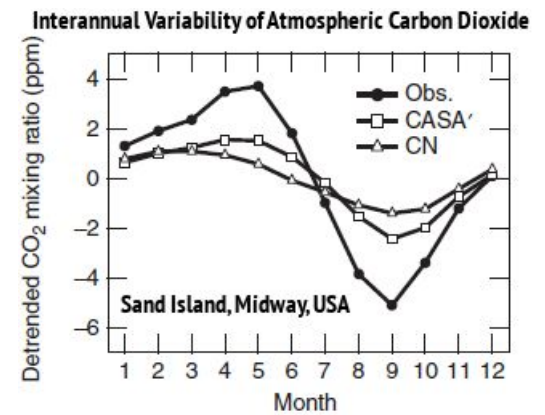
AGU24

Washington, D.C. | 9–13 December 2024

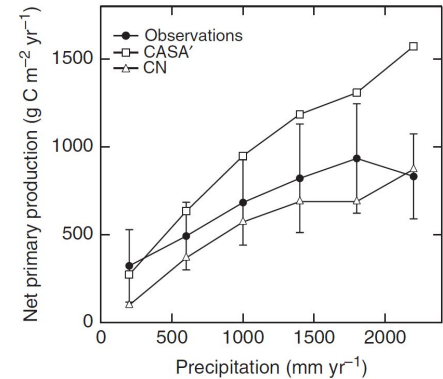
**WHAT'S NEXT FOR
SCIENCE**

What is a Benchmark?

- A **benchmark** is a quantitative test of model function achieved through comparison of model results with observational data
- Acceptable performance on a benchmark **is a necessary but not sufficient condition** for a fully functioning model
- **Functional relationship benchmarks** offer tests of model responses to forcings and yield insights into ecosystem processes
- Effective benchmarks must draw upon **a broad set of independent observations** to evaluate model performance at multiple scales



Models often fail to capture the amplitude of the seasonal cycle of atmospheric CO₂



Models may reproduce correct responses over only a limited range of forcing variables

(Randerson et al., 2009)



Why Benchmark Models?

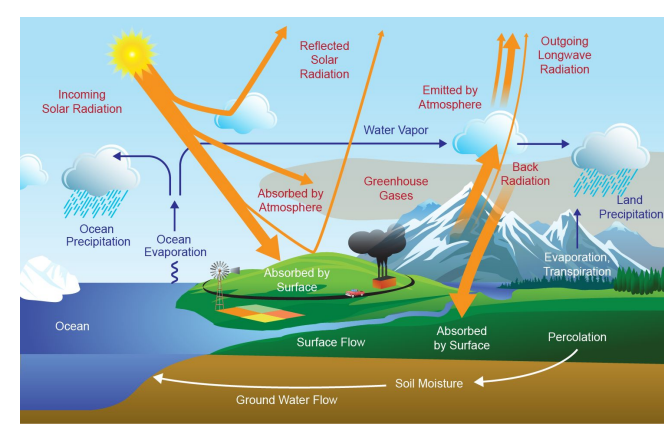
- To **quantify and reduce uncertainties** in carbon cycle feedbacks to improve projections of future climate change (Eyring et al., 2019; Collier et al., 2018)
- To **diagnose impacts of process-based or machine learning model development** on process representations and their interactions
- To **guide synthesis efforts**, such as the Intergovernmental Panel on Climate Change (IPCC), by determining which models are broadly consistent with observations (Eyring et al., 2019)
- To **increase scrutiny of key datasets** used for model evaluation
- To **identify gaps in existing observations** needed to inform model development
- To **accelerate delivery of new measurement datasets** for rapid and widespread use in model assessment



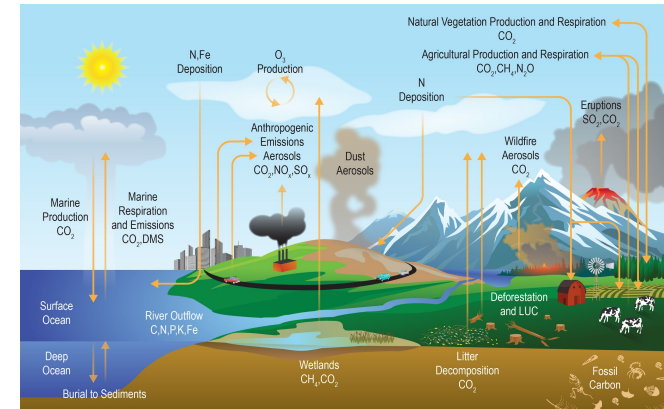
What is ILAMB?

A community coordination activity created to:

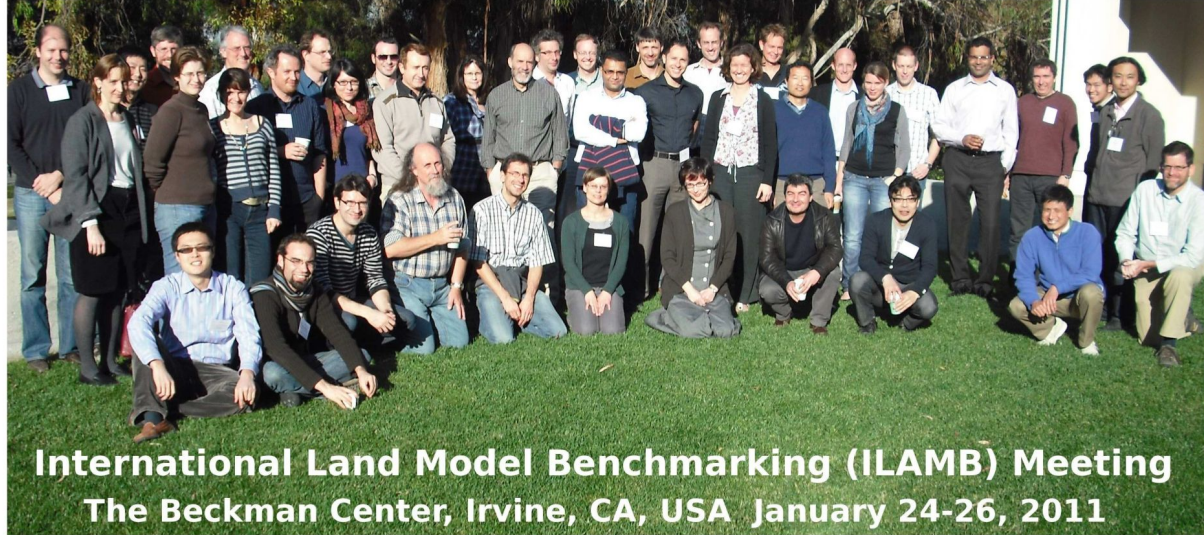
- **Develop internationally accepted benchmarks** for land model performance by drawing upon collaborative expertise
- **Promote the use of these benchmarks** for model intercomparison
- **Strengthen linkages between experimental, remote sensing, and Earth system modeling communities** in the design of new model tests and new measurement programs
- **Support the design and development of open source benchmarking tools**



Energy and Water Cycles



Carbon and Biogeochemical Cycles



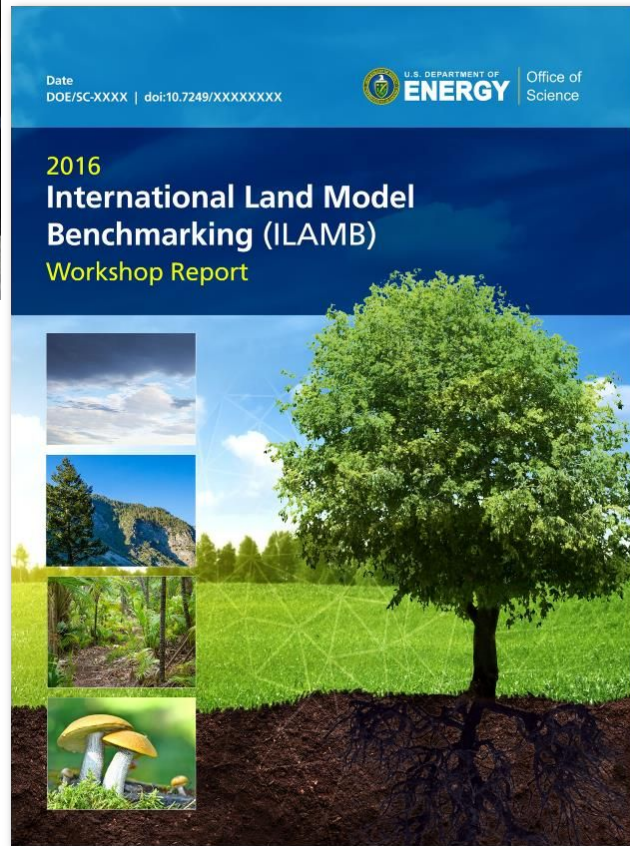
- **First ILAMB Workshop** was held in Exeter, UK, on June 22–24, 2009
- **Second ILAMB Workshop** was held in Irvine, CA, USA, on January 24–26, 2011
 - ~45 researchers participated from the US, Canada, UK, Netherlands, France, Germany, Switzerland, China, Japan, and Australia
 - Developed methodology for model-data comparison and baseline standard for performance of land model process representations (Luo et al., 2012)



2016 International Land Model Benchmarking (ILAMB) Workshop May 16–18, 2016, Washington, DC

Third ILAMB Workshop was held May 16–18, 2016

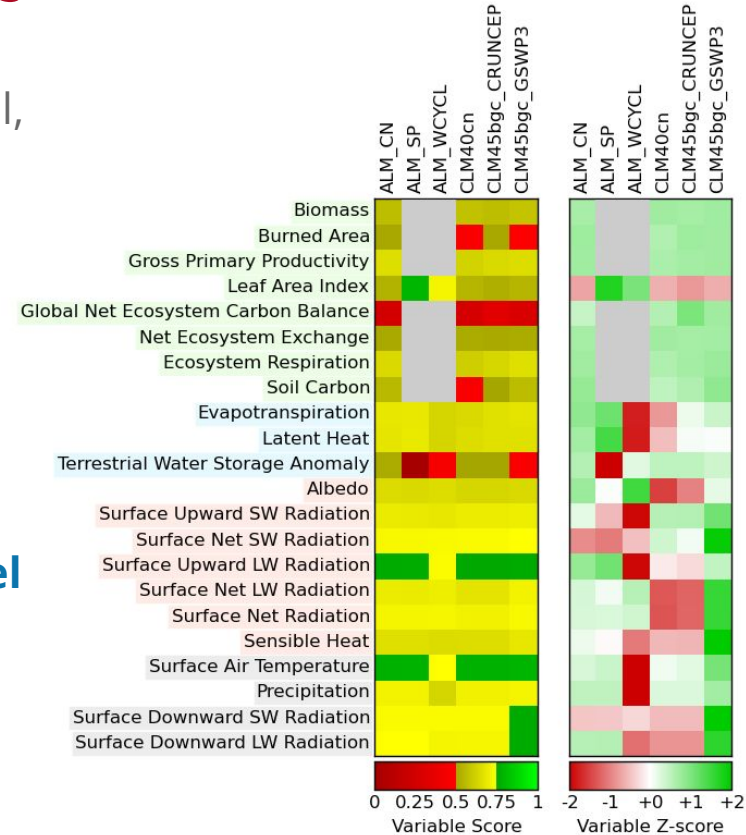
- Workshop Goals
 - Design of new metrics for model benchmarking
 - Model Intercomparison Project (MIP) evaluation needs
 - Model development, testbeds, and workflow processes
 - Observational datasets and needed measurements
- Workshop Attendance
 - 60+ participants from Australia, Japan, China, Germany, Sweden, Netherlands, UK, and US (10 modeling centers)
 - ~25 remote attendees at any time



(Hoffman et al., 2017)

Development of ILAMB Packages

- **ILAMBv1** released at 2015 AGU Fall Meeting Town Hall, doi:[10.18139/ILAMB.v001.00/1251597](https://doi.org/10.18139/ILAMB.v001.00/1251597)
- **ILAMBv2** released at 2016 ILAMB Workshop, doi:[10.18139/ILAMB.v002.00/1251621](https://doi.org/10.18139/ILAMB.v002.00/1251621)
- **ILAMBv3** *Coming Soon!*
- **Open Source software** written in Python; **runs in parallel** on laptops, clusters, and supercomputers
- Routinely used for land model evaluation during development of ESMs, including the **E3SM Land Model** (Zhu et al., 2019) and the **CESM Community Land Model** (Lawrence et al., 2019)
- **Models are scored** based on statistical comparisons and functional response metrics





ILAMB Produces Diagnostics and Scores Models

- ILAMB generates a top-level **portrait plot** of models scores
- For every variable and dataset, ILAMB can automatically produce
 - **Tables** containing individual metrics and metric scores (when relevant to the data), including
 - Benchmark and model **period mean**
 - **Bias** and **bias score** (S_{bias})
 - **Root-mean-square error (RMSE)** and **RMSE score** (S_{rmse})
 - **Phase shift** and **seasonal cycle score** (S_{phase})
 - **Interannual coefficient of variation** and **IAV score** (S_{iaiv})
 - **Spatial distribution score** (S_{dist})
 - **Overall score** (S_{overall})
 - **Graphical diagnostics**
 - Spatial contour maps
 - Time series line plots
 - Spatial Taylor diagrams (Taylor, 2001)
- Similar **tables** and **graphical diagnostics** for functional relationships

$$S_{\text{overall}} = \frac{S_{\text{bias}} + 2S_{\text{rmse}} + S_{\text{phase}} + S_{\text{iaiv}} + S_{\text{dist}}}{1 + 2 + 1 + 1 + 1}$$



ILAMB Current Variables

- **Biogeochemistry:** Biomass (Contiguous US, Pan Tropical Forest), Burned area (GFED3), CO₂ (NOAA GMD, Mauna Loa), Gross primary production (Fluxnet, GBAF), Leaf area index (AVHRR, MODIS), Global net ecosystem carbon balance (GCP, Khatiwala/Hoffman), Net ecosystem exchange (Fluxnet, GBAF), Ecosystem Respiration (Fluxnet, GBAF), Soil C (HWSD, NCSCDv22, Koven)
- **Hydrology:** Evapotranspiration (GLEAM, MODIS), Evaporative fraction (GBAF), Latent heat (Fluxnet, GBAF, DOLCE), Runoff (Dai, LORA), Sensible heat (Fluxnet, GBAF), Terrestrial water storage anomaly (GRACE), Permafrost (NSIDC)
- **Energy:** Albedo (CERES, GEWEX.SRB), Surface upward and net SW/LW radiation (CERES, GEWEX.SRB, WRMC.BSRN), Surface net radiation (CERES, Fluxnet, GEWEX.SRB, WRMC.BSRN)
- **Forcing:** Surface air temperature (CRU, Fluxnet), Diurnal max/min/range temperature (CRU), Precipitation (CMAP, Fluxnet, GPCC, GPCP2), Surface relative humidity (ERA), Surface down SW/LW radiation (CERES, Fluxnet, GEWEX.SRB, WRMC.BSRN)

ILAMB Assessing Multiple Generations of CLM

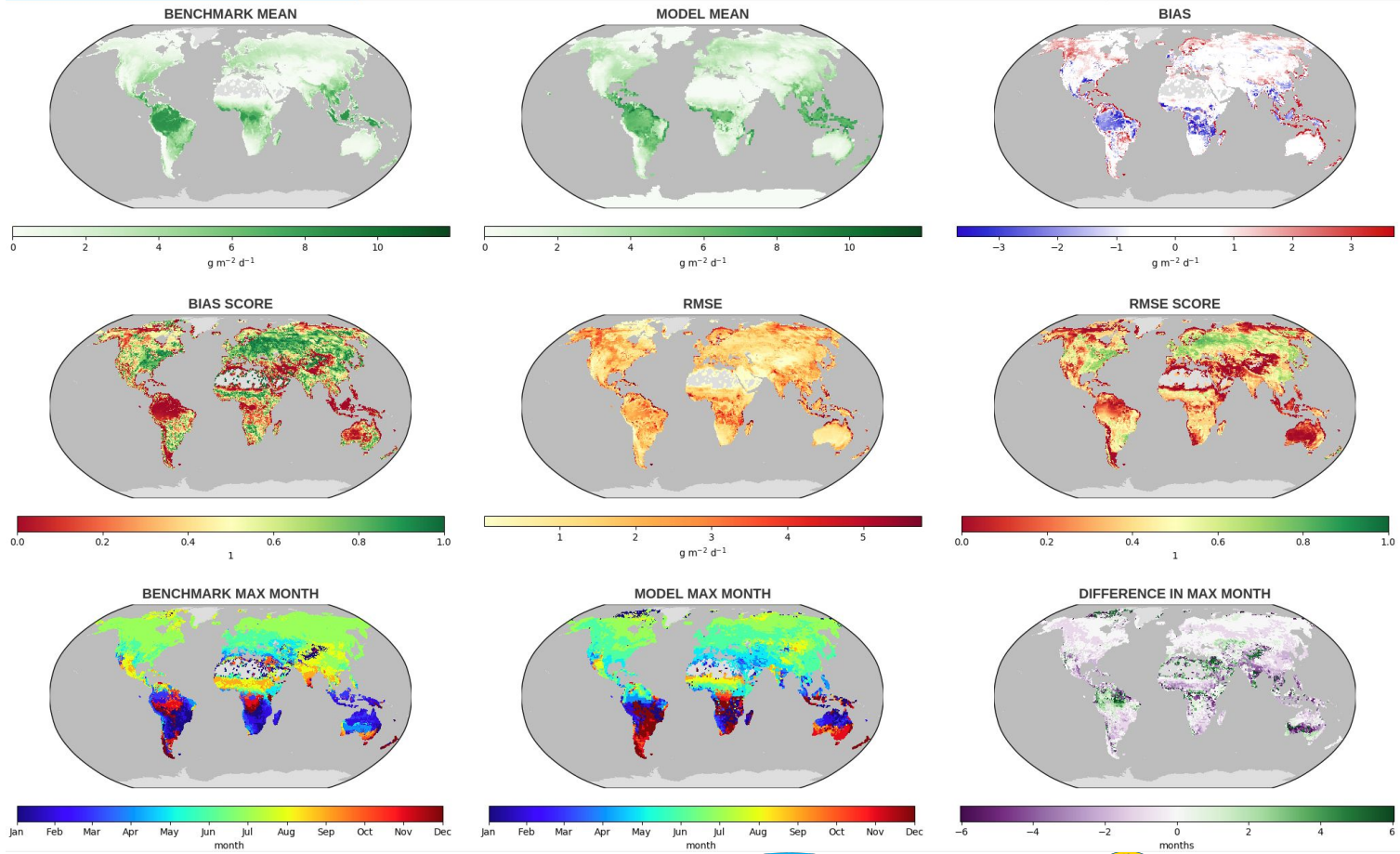
	CLM4	CLM4.5	CLM5
Ecosystem and Carbon Cycle			
Biomass			
Burned Area			
Carbon Dioxide			
Gross Primary Productivity			
Leaf Area Index			
Global Net Ecosystem Carbon Balance			
Net Ecosystem Exchange			
Ecosystem Respiration			
Soil Carbon			
Hydrology Cycle			
Evapotranspiration			
Evaporative Fraction			
Latent Heat			
Runoff			
Sensible Heat			
Terrestrial Water Storage Anomaly			
Permafrost			
Radiation and Energy Cycle			
Albedo			
Surface Upward SW Radiation			
Surface Net SW Radiation			
Surface Upward LW Radiation			
Surface Net LW Radiation			
Surface Net Radiation			
Forcing			

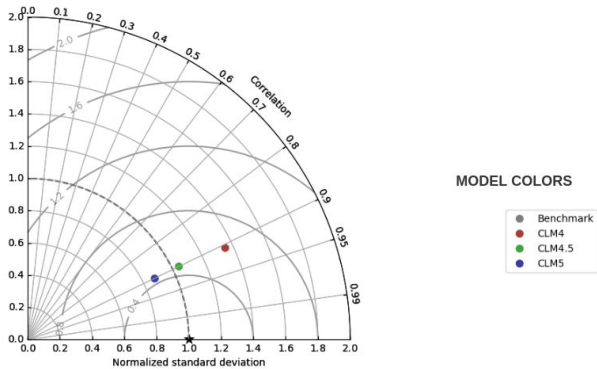
- Improvements in mechanistic treatment of hydrology, ecology, and land use with much more complexity in Community Land Model version 5 (CLM5)
- Simulations improved even with enhanced complexity
- Observational datasets not always self-consistent
- Forcing uncertainty confounds assessment of model development

http://webext.cgd.ucar.edu/I20TR/build_set1F/
(Lawrence et al., 2019)



ILAMB Graphical Diagnostics





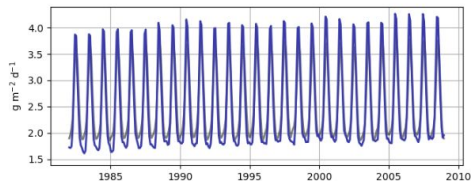
ILAMB Graphical Diagnostics

Spatially integrated regional mean

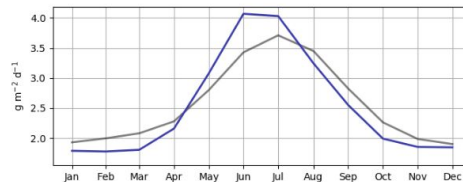
MODEL COLORS

- Benchmark
- CLM4
- CLM4.5
- CLM5

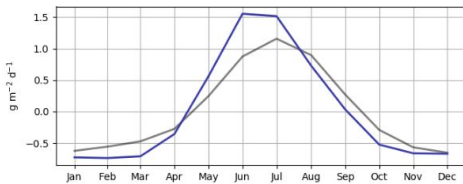
REGIONAL MEAN



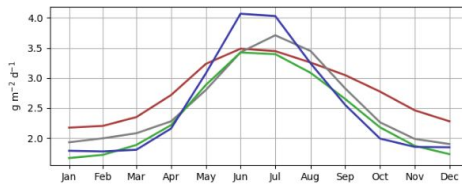
ANNUAL CYCLE



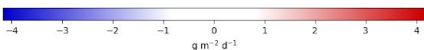
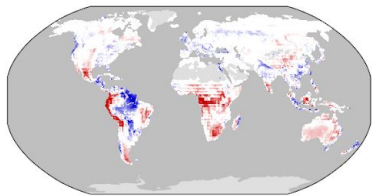
MONTHLY ANOMALY



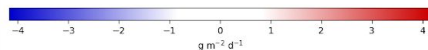
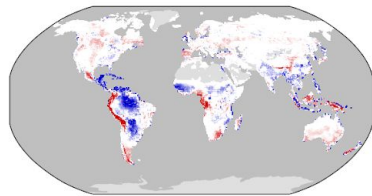
ANNUAL CYCLE



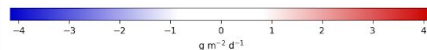
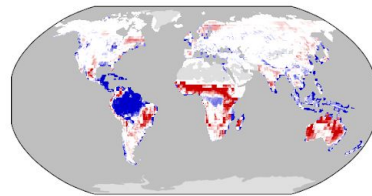
bcc-csm1-1



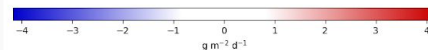
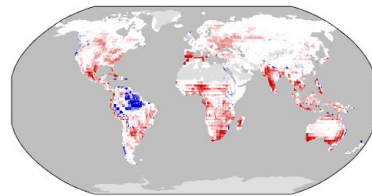
BCC-CSM2-MR



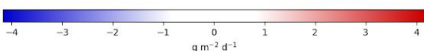
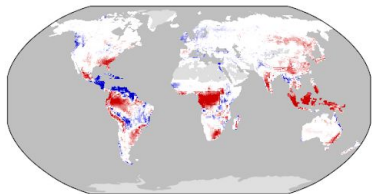
CanESM2



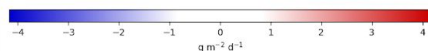
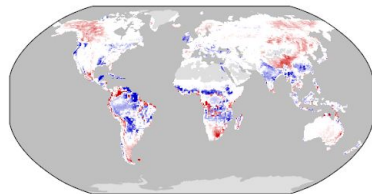
CanESM5



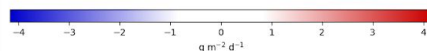
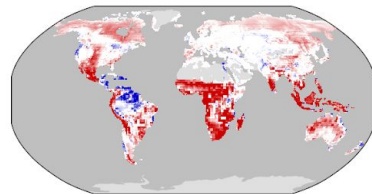
CESM1-BGC



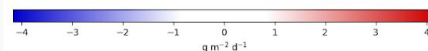
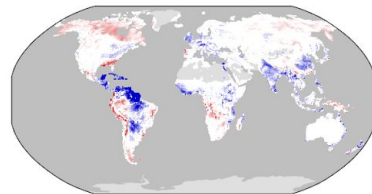
CESM2



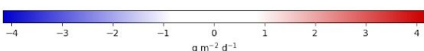
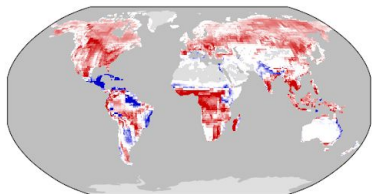
GFDL-ESM2G



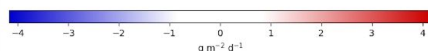
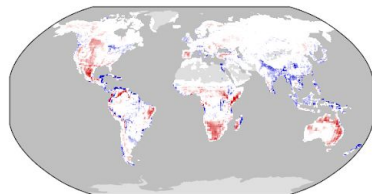
GFDL-ESM4



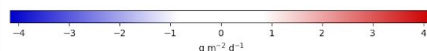
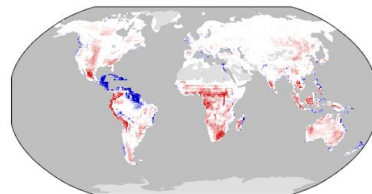
IPSL-CM5A-LR



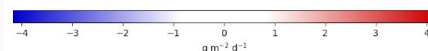
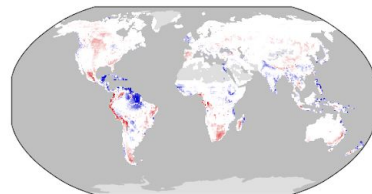
IPSL-CM6A-LR



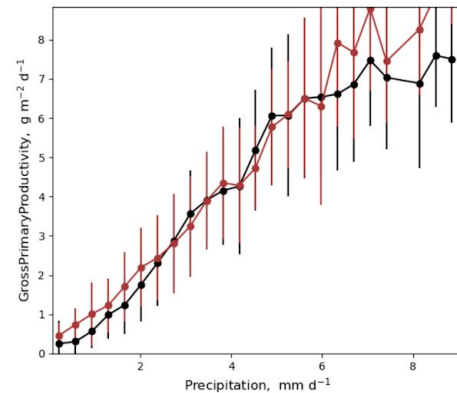
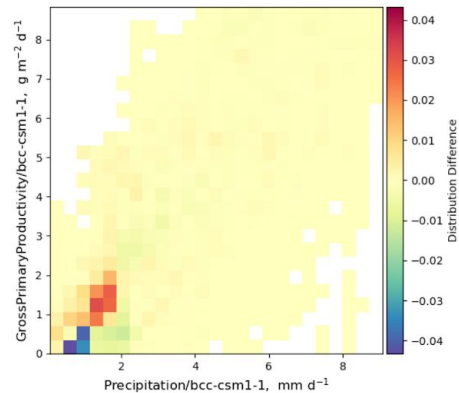
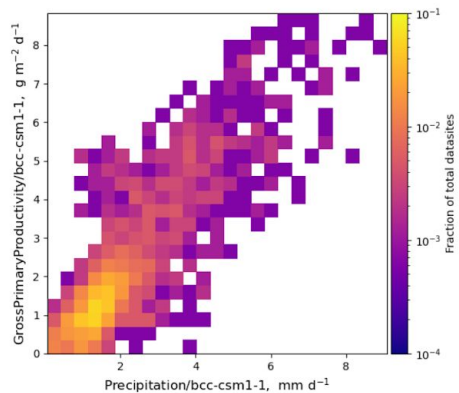
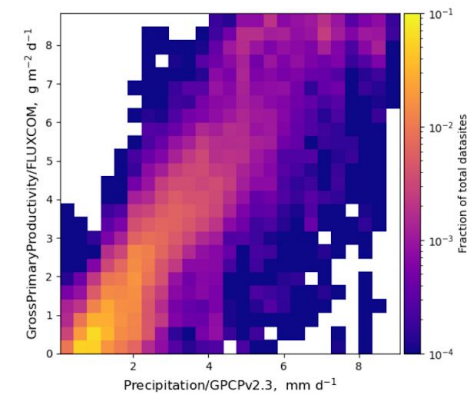
MeanCMIP5



MeanCMIP6



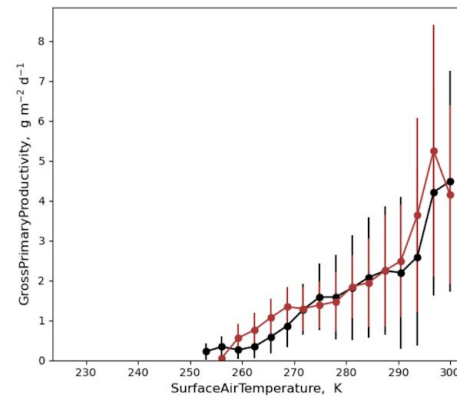
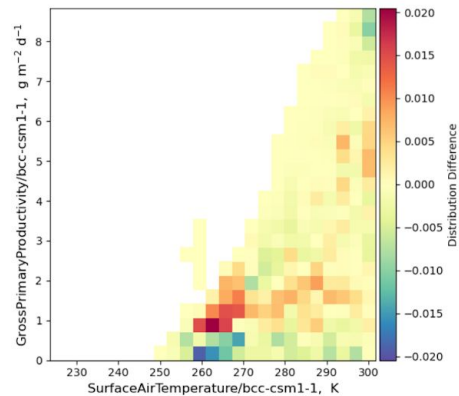
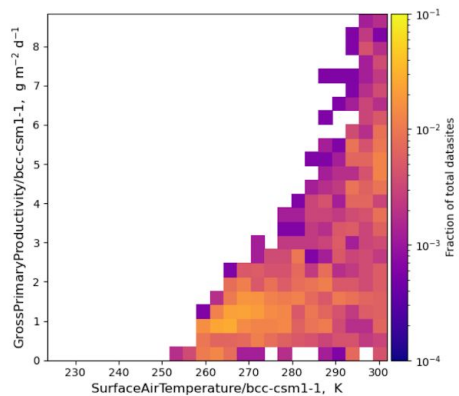
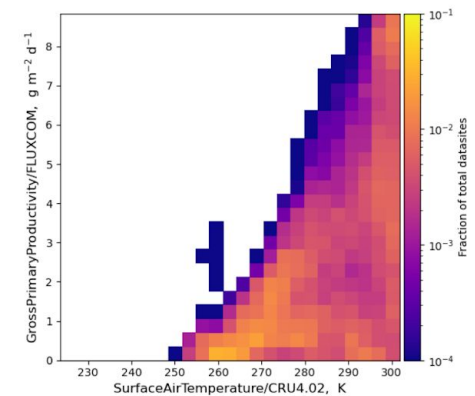
⊕ Precipitation/GPCPv2.3



⊕ SurfaceDownwardSWRadiation/CERESed4.1

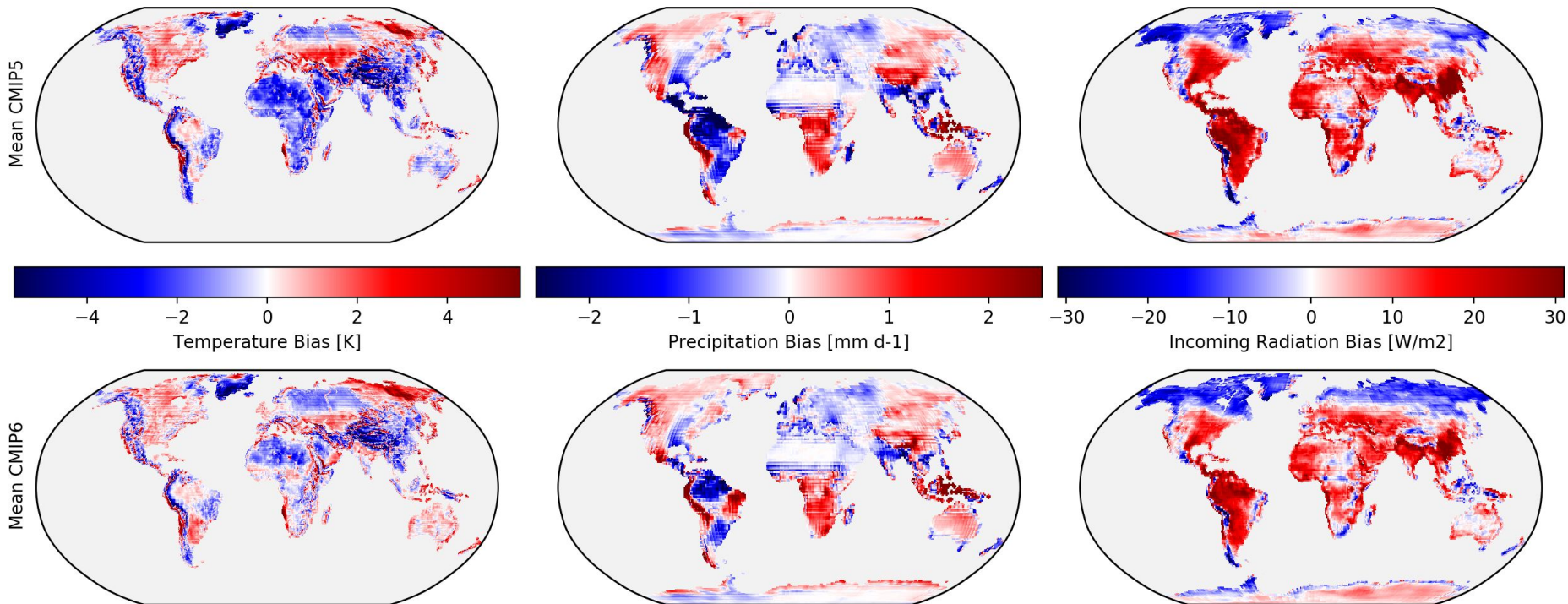
⊕ SurfaceNetSWRadiation/CERESed4.1

⊖ SurfaceAirTemperature/CRU4.02



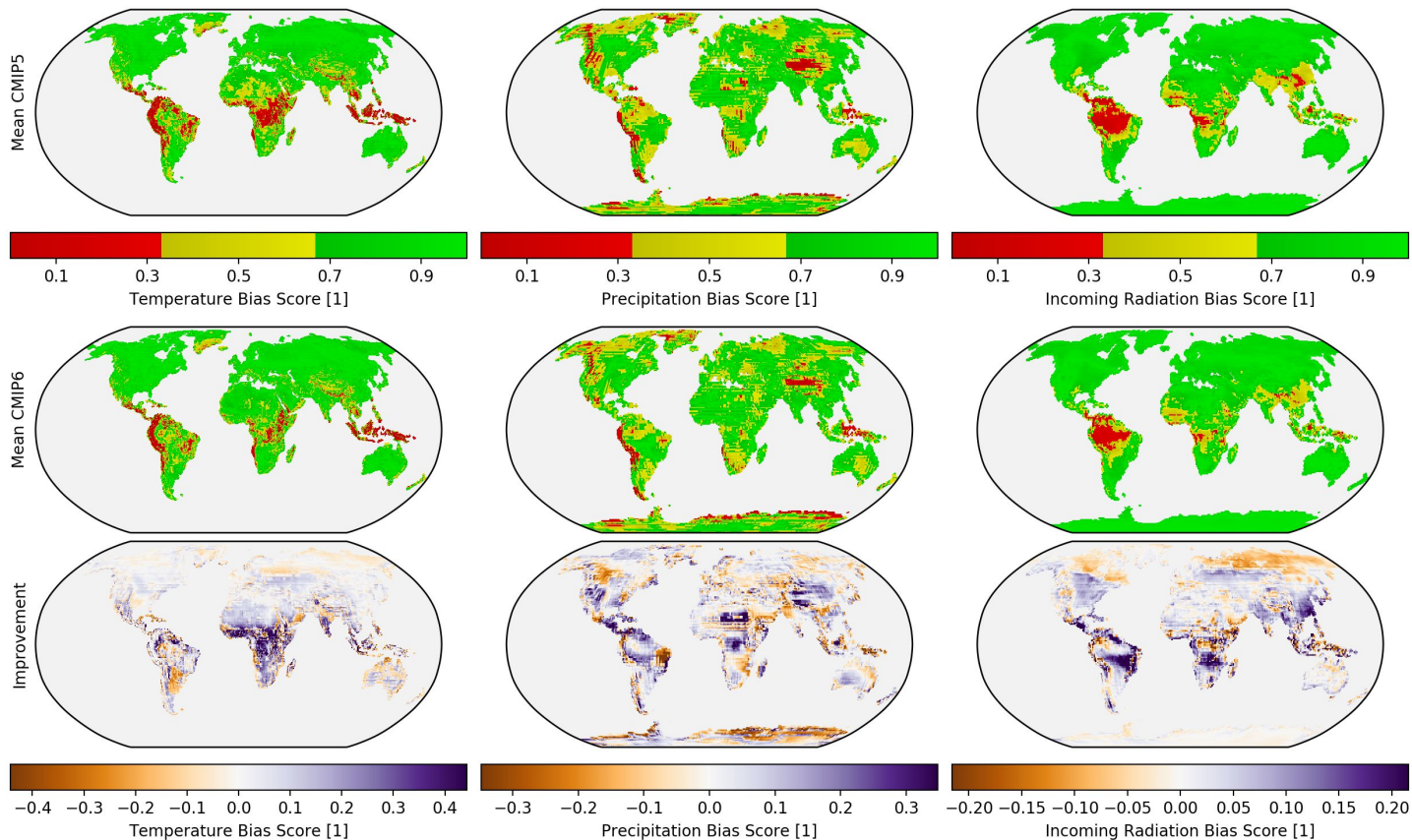
Reasons for Land Model Improvements

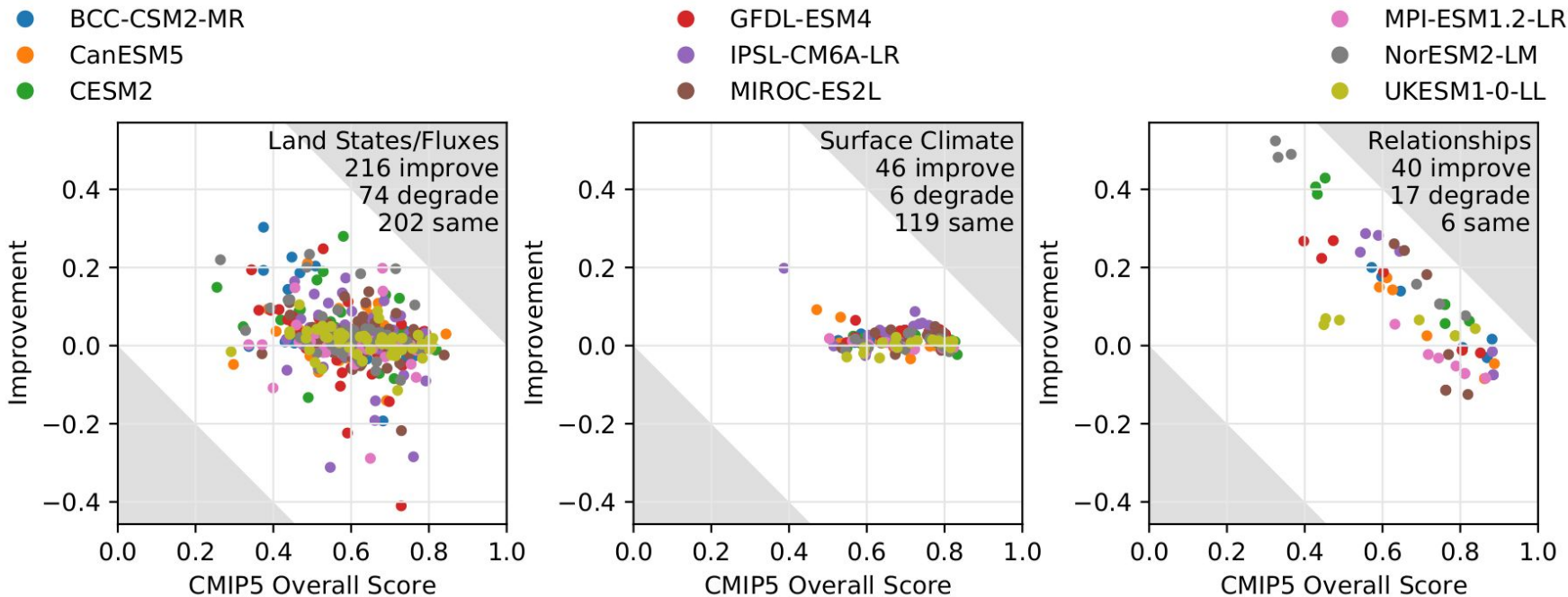
ESM improvements in climate forcings (temperature, precipitation, radiation) likely partially drove improvements exhibited by land carbon cycle models



Reasons for Land Model Improvements

Differences in bias scores for temperature, precipitation, and incoming radiation were primarily positive, further indicating more realistic climate representation

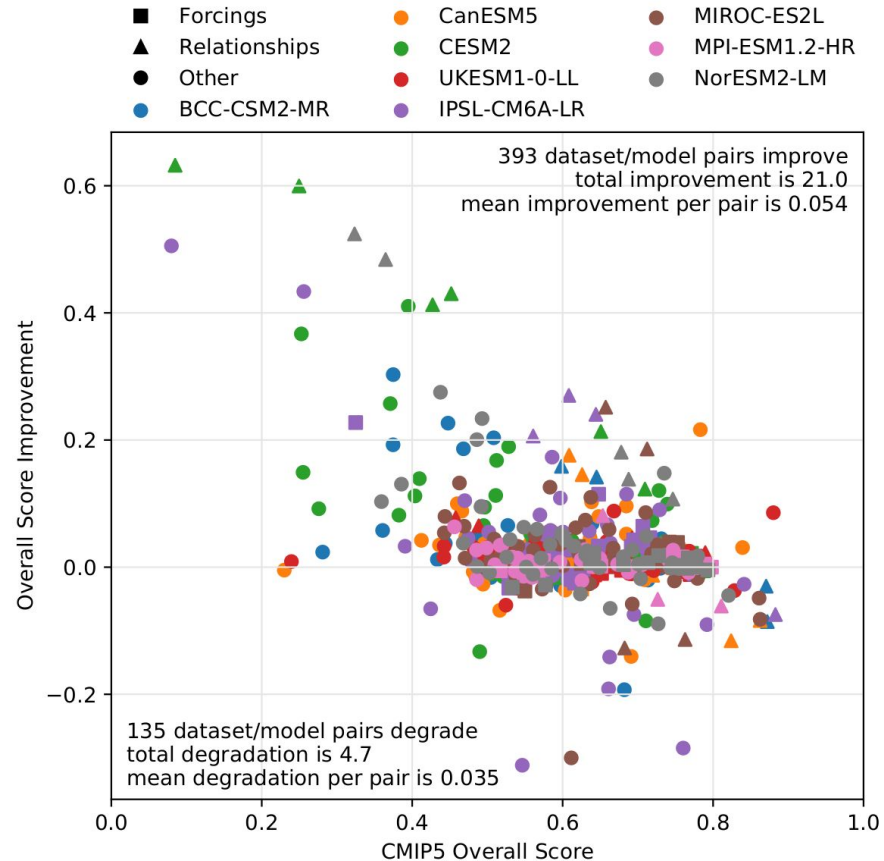




Across all land models, scores for most state and flux variables improved (216) or remained nearly the same (202), although some were degraded (74). While atmospheric forcings from CMIP6 ESMs were improved over those from CMIP5 ESMs, the largest improvements were in land model **variable-to-variable relationships**, suggesting that increased land model development was also partially responsible for higher CMIP6 land model scores.

Reasons for Land Model Improvements

While forcings got better, the largest improvements were in **variable-to-variable relationships**, suggesting that increased land model complexity was also partially responsible for higher CMIP6 model scores



ILAMB & IOMB CMIP5 vs 6 Evaluation

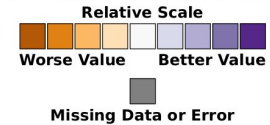
- (a) ILAMB and (b) IOMB have been used to evaluate how land and ocean model performance have changed from CMIP5 to CMIP6
- Model fidelity is assessed through comparison of historical simulations with a wide variety of contemporary observational datasets
- The UN's Intergovernmental Panel on Climate Change (IPCC) Sixth Assessment Report (AR6) from Working Group 1 (WG1) Chapter 5 contains the full ILAMB/IOMB evaluation as Figure 5.22

(a) Land Benchmarking Results

	bcc-csm1-1	CanESM2	CanESM1-BGC	GFDL-ESM2G	IPSL-CM5A-LR	MIROC-ESM	MPI-ESM-LR	NorESM1-ME	HadGEM2-ES	BCC-CSM2-MR	CanESM5	CESM2	GFDL-ESM4	IPSL-CM6A-LR	MIROC-ES2L	MPI-ESM1-2-LR	NorESM2-LM	UKESM1-0-LL	Mean CMIP5	Mean CMIP6
Land Ecosystem & Carbon Cycle																				
Biomass	-0.72	-0.93	-1.95	-1.51	-0.13	0.60	-0.43	-1.31	0.19	-0.43	0.66	0.48	-1.09	0.22	0.60	-0.07	1.00	0.49	1.63	-2.30
Burned Area	0.20	-0.45	-1.52	-0.40	-1.26	-0.26	-1.07	-1.77	0.92	1.39	0.74	-0.20	-0.54	0.16	0.93	-0.96	-0.01	1.04	1.23	1.82
Leaf Area Index	-0.20	-0.64	-1.30	-2.53	-0.01	0.30	0.01	-1.85	-0.16	0.27	0.08	0.34	-0.70	1.19	0.82	0.46	0.37	0.69	1.04	1.61
Soil Carbon	0.27	1.26	1.46	0.07	0.75	0.47	-0.03	-1.14	0.07	0.23	1.35	-0.99	-2.04	-1.55	0.90	-0.75	-0.17	0.24	1.01	1.48
Gross Primary Productivity	0.59	-1.23	0.01	1.81	-1.40	0.29	-0.53	-0.24	-1.04	0.77	0.04	0.59	-0.38	1.17	-1.02	-0.37	0.73	0.09	1.51	2.22
Net Ecosystem Exchange	-0.42	1.81	-0.21	-0.65	1.10	-0.24	0.80	0.02	-1.03	-1.02	-1.19	0.59	1.69	-0.42	0.63	-0.21	1.08	-1.43	1.28	1.43
Ecosystem Respiration	0.90	-0.56	-0.86	-0.24	1.35	0.99	-0.01	-0.94	-1.54	0.81	0.59	0.51	-0.79	0.90	-0.21	-1.24	0.43	-0.94	1.34	2.21
Carbon Dioxide	-1.54	-0.36	-2.92	-0.74	1.53	-0.00	0.37	0.85		0.42	-0.26	0.39	0.59	1.10	-0.87	0.21	0.69	-0.09	-0.07	
Global Net Carbon Balance	-1.64	-0.88	-1.13	0.17	-0.31	-0.38	-0.50	0.24		-0.23	1.34	-1.70	0.17	-0.74	1.45	1.56	0.26	0.92	1.40	
Land Hydrology Cycle																				
Evapotranspiration	-2.65	-0.42	0.44	-0.18	-0.49	-0.52	-0.57	0.17	0.70	0.15	-0.47	1.51	-1.24	0.58	-0.72	-0.83	0.97	0.87	1.00	1.70
Evaporative Fraction	-0.34	0.74	0.74	-0.14	0.85	0.21	1.98	0.22	-0.34	0.10	0.11	1.25	-0.88	1.29	-1.65	-1.81	1.11	-0.06	0.98	1.29
...																				
Terrestrial Water Storage Anomaly	-2.79	-0.45	0.47	0.50	-0.38	0.34	0.35	0.43	0.58	0.15	-0.08	0.95	-2.91	0.43	0.37	0.15	0.39	0.51	0.49	0.50
Permafrost	-0.88	2.26	0.01	0.13	0.83	0.69	0.56	0.69	-0.56	-0.11	-3.02	0.83	0.74	-0.18	0.49	0.42	0.89	0.43	0.06	0.23

(b) Ocean Benchmarking Results

	bcc-csm1-1	CanESM2	CanESM1-BGC	GFDL-ESM2G	IPSL-CM5A-LR	MIROC-ESM	MPI-ESM-LR	NorESM1-ME	HadGEM2-ES	BCC-CSM2-MR	CanESM5	CESM2	GFDL-ESM4	IPSL-CM6A-LR	MIROC-ES2L	MPI-ESM1-2-LR	NorESM2-LM	UKESM1-0-LL	Mean CMIP5	Mean CMIP6	
Ocean Ecosystems																					
Chlorophyll		2.18	0.20	-0.20		0.04		0.22		-0.37	0.83	-0.37	-0.26	-0.91	-0.67	1.93	0.27	0.30	0.67		
Oxygen, surface		-1.50	2.19	0.44	1.02	0.49	0.56			-0.67	0.88	-0.21	0.10	-1.02	-0.41	2.19	0.18	0.13	0.64		
Ocean Nutrients																					
Nitrate, surface		-0.84	-0.10	0.91		-0.80	-1.25			-0.02	1.00	1.88		-0.90	-1.14	-0.17	-0.16	1.60			
Phosphate, surface		0.21	-1.63	0.67	1.22		-0.18	-1.70	0.82		1.21	-0.90	0.29	1.21	1.02	0.39	-1.78	-0.56	-0.47	0.18	
Silicate, surface		-0.69	-0.04	0.04		-0.45	-0.43			0.39	-0.14	0.17	-0.41	-0.98	0.00	0.02	0.88	1.63			
Ocean Carbon																					
TALK, surface		0.44	-0.71	0.24		-0.81	-0.20	2.16			1.24	-0.23	-0.62	-0.69	-1.08	-1.12	1.31			1.19	
Salinity, 700m		-0.27	1.01	0.12	0.19		0.32	-2.31	-0.22		0.06	-0.36	0.85	-0.42	0.29	2.48	1.27	0.06	1.27	0.54	
Ocean Relationships																					
Oxygen, surface/WOA2018		0.44	-0.35	-1.06	-0.54	0.70	0.46	-0.46	-0.80	0.32	0.36	0.25	-1.16	-0.47	0.54	0.33	-0.39	-0.87	-0.54	1.58	1.64
Nitrate, surface/WOA2018		-1.86	-0.36	-0.29		1.50	-0.43	0.68			-0.02	0.72	1.20	0.17	1.86	0.02		-1.12	0.39	1.25	





ILAMBV3: Coming Soon!

- Continuously updated documentation as new modules are being developed:
<https://ilamb3.readthedocs.io/>

```
In [2]: import matplotlib.pyplot as plt
import ilamb3
from ilamb3.analysis import bias_analysis
```

Initialize an analysis, specifying the variable name to be compared.

```
In [3]: analysis = bias_analysis("biomass")
```

Load two ILAMB data products using a built-in catalog

```
In [4]: cat = ilamb3.ilamb_catalog()
ds_esacci = cat["biomass | ESACCI"].read()
ds_xu = cat["biomass | XuSaatchi2021"].read()
```

Apply the analysis using the ESACCI product as a reference.

```
In [5]: df, ds_esacci, ds_xu = analysis(ds_esacci, ds_xu)
```

```
In [6]: df
```

Out[6]:

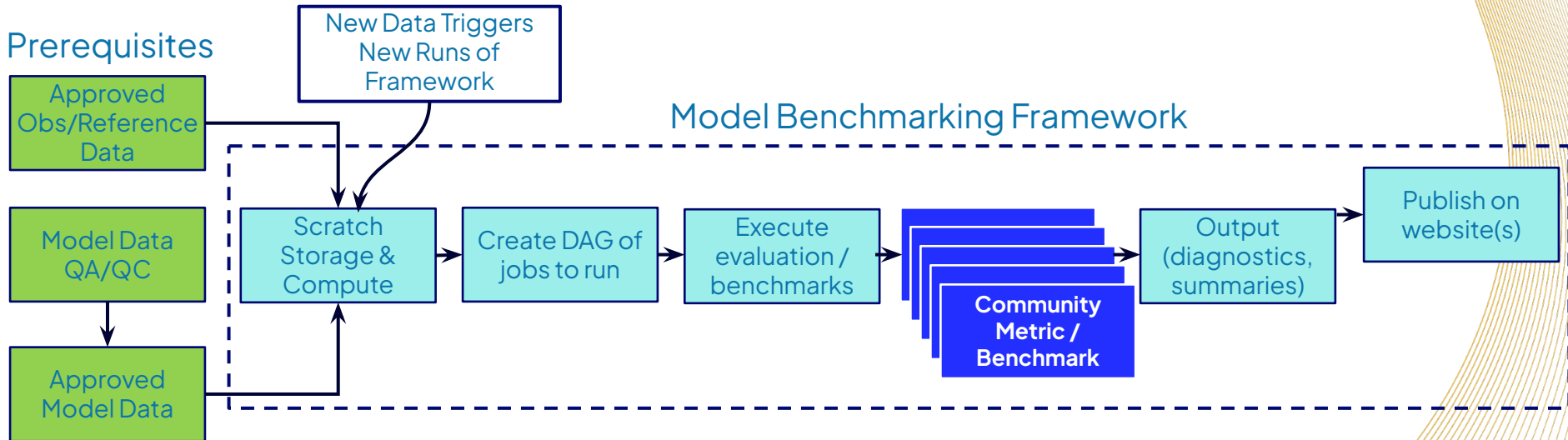
	source	region	analysis	name	type	units	value
0	Reference	None	Bias	Period Mean	scalar	Mg ha-1	24.019928
1	Comparison	None	Bias	Period Mean	scalar	Mg ha-1	25.676543
2	Comparison	None	Bias	Bias	scalar	Mg ha-1	-16.670597
3	Comparison	None	Bias	Bias Score	score	1	0.398491

The screenshot shows the documentation page for ilamb3. It features the RUBISCO logo at the top left. The main heading is "Documentation for ilamb3". Below the heading, there is a paragraph explaining that a rewrite of ILAMB has been a long time in the works, and that the ecosystem of scientific python libraries has changed dramatically since the first version. It mentions that the CF conventions are now more completely and elegantly handled by xarray and related packages. There is also a section titled "Design Principles" which lists the goal of making adding analysis methods more simple and the basic object being the xarray dataset. The page includes a search bar, a "I WANT TO..." section with links to "Run Analysis in a Notebook" and "Add an Analysis", a "METHODS" section with links to "Preliminary Definitions", "Bias", and "Relationships", and a "REFERENCE" section with a link to "Package API".

- ILAMBV3 allows for analysis methods to be imported into Python scripts and Jupyter notebooks and used to produce the scalars and plots synthesized in the full analysis
- At right, the ILAMB bias analysis is applied to two reference data products and show a table of scalar values

CMIP Rapid Evaluation Framework Overview

The Coupled Model Intercomparison Project (CMIP) Model Benchmarking Task Team developed a system specification for a Rapid Evaluation Framework (REF) that would leverage community benchmarking metrics to evaluate CMIP model output as they are submitted to the Earth System Grid Federation (ESGF)





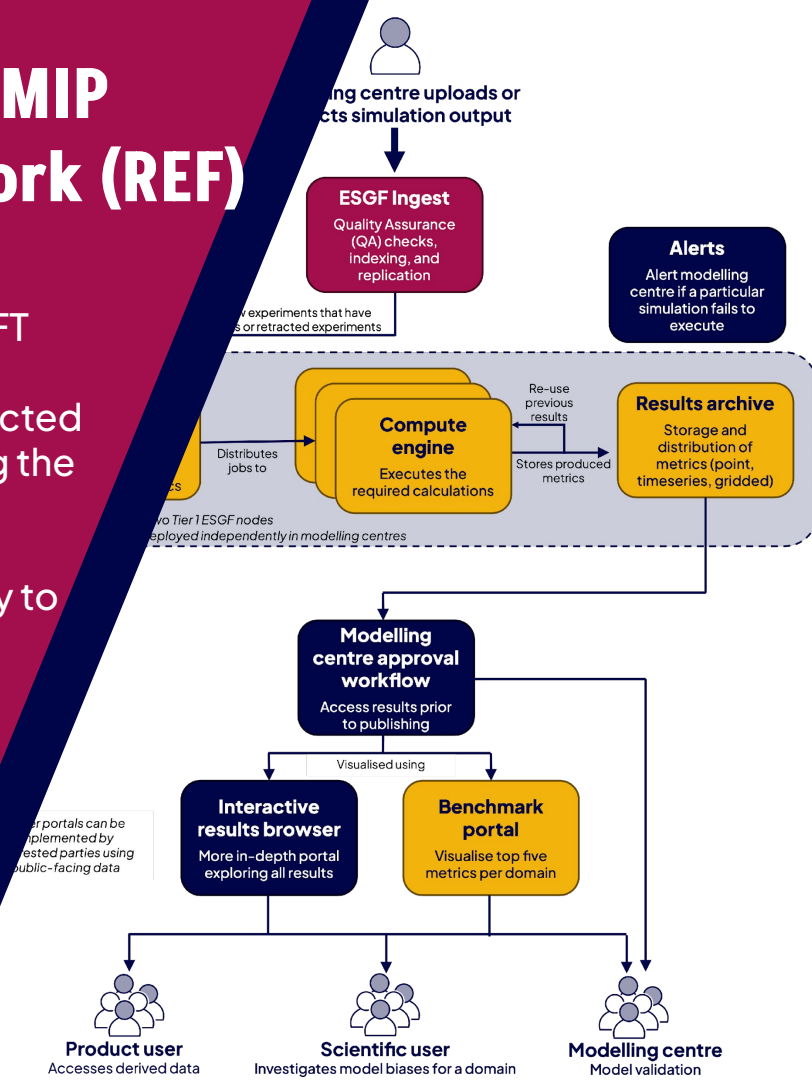
Find out more about the CMIP Rapid Evaluation Framework (REF)

The CMIP AR7 Fast Track Rapid Evaluation Framework (AR7 FT REF) will be a complete end to end system providing a systematic and rapid performance assessment of the expected models participating in the CMIP AR7 Fast Track, supporting the next IPCC Assessment Report 7 (AR7) cycle.

The REF is designed to be a starting point for the community to develop and build upon, with applications across the World Climate Research Programme (WCRP) and beyond.

Find out more at wcrp-cmip.org/cmip7/rapid-evaluation-framework/

This project has been made possible by funding from:



Summary

- **Model benchmarking** is increasingly important as model complexity increases
- Systematic model benchmarking is useful for
 - **Verification** – during model development to confirm that new model code improves performance in a targeted area without degrading performance in another area
 - **Validation** – when comparing performance of one model or model version to observations and to other models or other model versions
- The **ILAMB package** employs a suite of in situ, remote sensing, and reanalysis datasets to comprehensively evaluate and score land model performance, *irrespective of any model structure or set of process representations*
- ILAMB is **Open Source**, is written in **Python**, **runs in parallel** on laptops to supercomputers, and has been **adopted in most modeling centers**
- *Usefulness* of ILAMB depends on the quality of incorporated observational data, characterization of uncertainty, and selection of relevant metrics