

Making Climate Model Evaluation available for End Users: an example with ENSO metrics



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and the CLIVAR ENSO Research Focus

IPSL/LOCEAN, NCAS-Climate, PCMDI, GFDL

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16-18 October 2018. Guayaquil - Ecuador*



Evaluating climate models

- Model evaluation:
 - **Exploratory** = understand mechanisms in models
 - **Consensus** = evaluate « the fitness for purpose »
- Metrics vs. diagnostics
- In scope here: consensus model evaluation
metrics and diagnostics

Strategy for routine Earth system model evaluation in CMIP

Model Output



Processing Capability



Data Archive

Observations and Reanalyses



Analysis computing environment integrated with the ESGF

Eyring et al., ESD (2016)

Well-Established Analysis
Sharing of Diagnostic Code
Guidance and support from CMIP Panel,
WGNE/WGCM Climate Model Metrics
Panel and , CMIP6-Endorsed MIPs

Standardised Interfaces

Community-tools for Routine ESM Evaluation

Visualization & documentation of evaluation results
Record of provenance
Scientific interpretation
Additional in-depth analysis

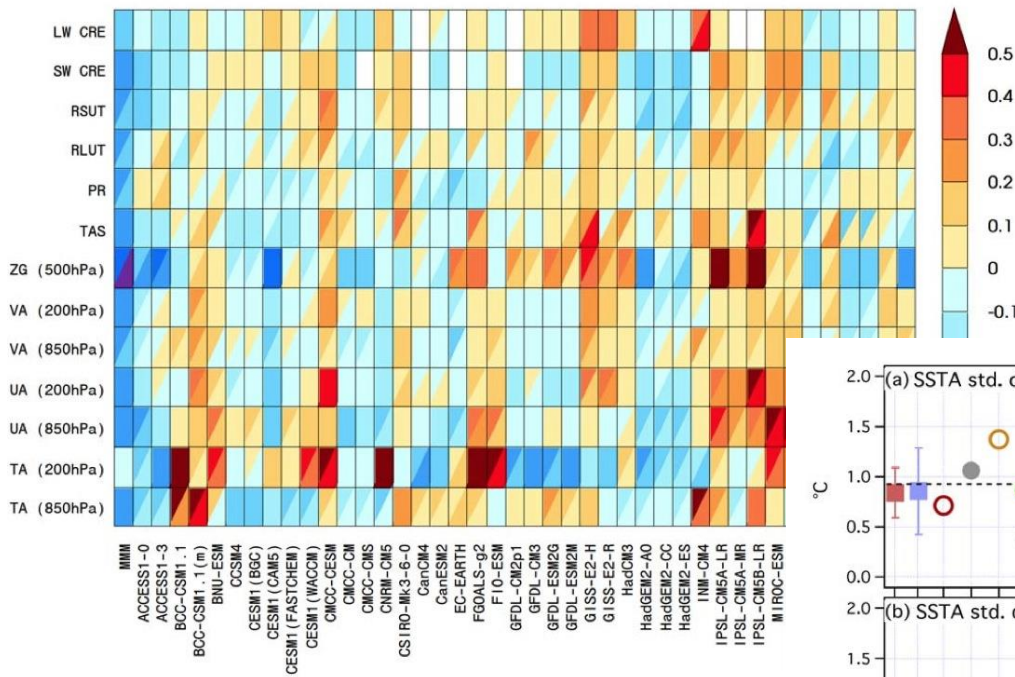
State evaluation of ECVs (climatology, trends, ...)
Process and phenomena evaluation
Link to projections (MMM analysis and emergent constraints)
Performance metrics

Community experience gathered via pilot projects running alongside the ESGF for CMIP



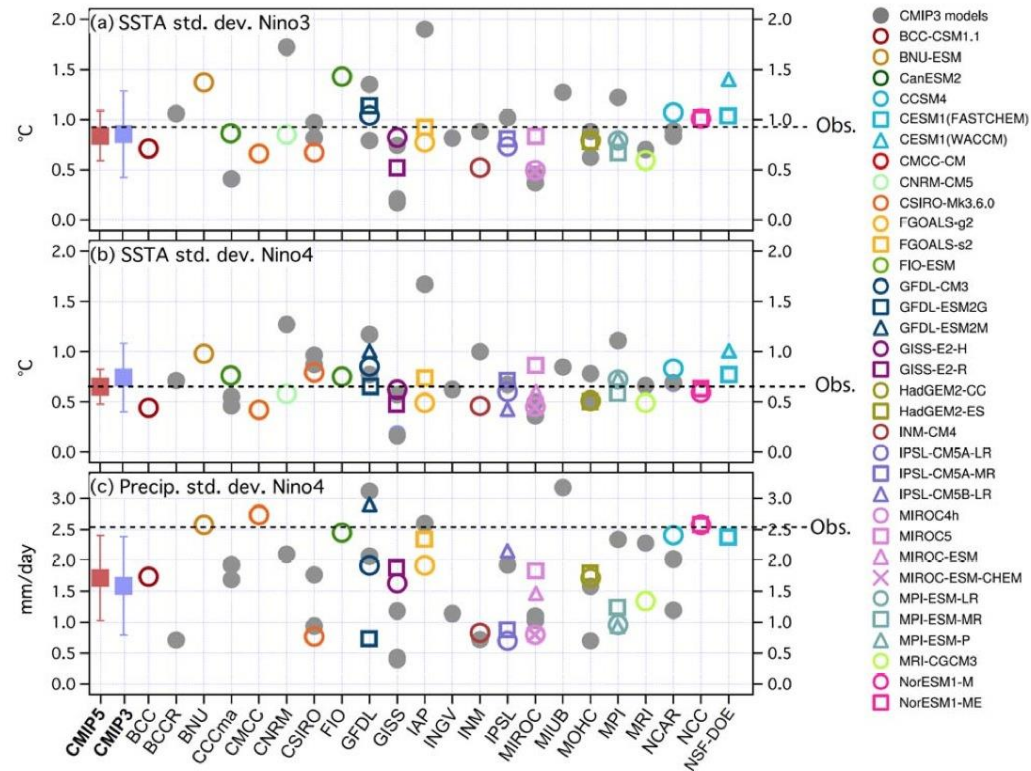
PCMDI Metrics Package (PMP)

Examples of consensus climate model evaluation



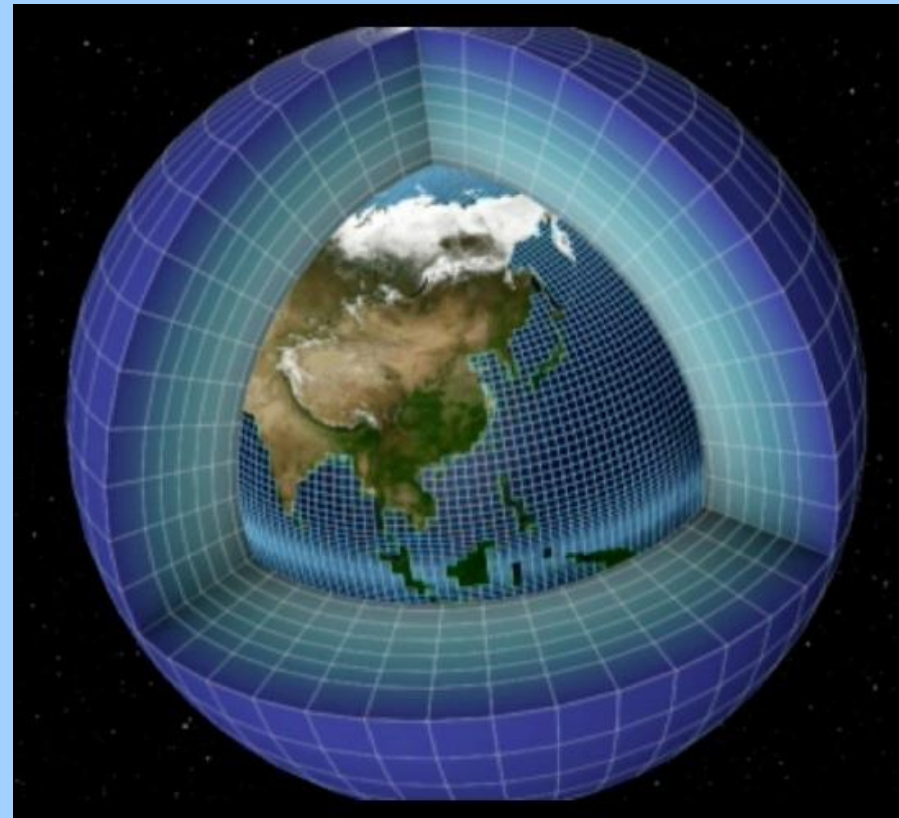
Produce such figures
Cf. Chap 9 IPCC AR5

Fitness for purpose: can we use these models to assess climate change ?



Making sense of climate simulations


- Huge amount of data
- Complex models and processes
- Hard to get to
- Hard to analyse



Can be intimidating...
.. risk of wrong usage



Climate models end users need best advice/support

- WCRP new Overarching Scientific Objectives 
 1. Fundamental understanding of the climate system
 2. Advancing predictive skill on timescales up to a decade
 3. Constraining projections on decadal to centennial timescales
 4. **Connecting climate science with policy and services**
- Climate services (GFCS/WMO)
- Co-construction with non-experts in climate science and models

Model evaluation: the good, the bad and the ugly

Climate information users



Define science question

Choose metric(s)
Choose model(s)

Run and view metric

Analyse results

Climate experts



Define metrics
Def. observations
Document metric = $f(\text{science question})$

Program metric

Science governance

Software and data engineers



Science / IT interface

Build software to run metric

Build software to view metric

IT governance

Science question interface

User interface(s)

Articulate different actors, different expertise and expectations

Separation of concerns for routine and consensus model evaluation

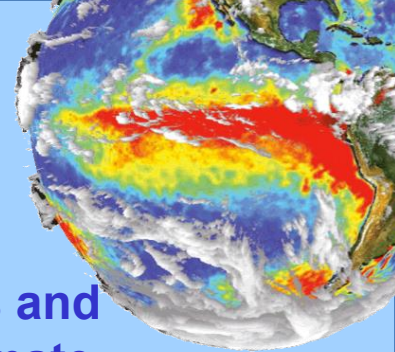
- User needs state-of-the-art :
 - **Science** of model evaluation
 - **Software** tools for model evaluation
- Different experts -> different governance
- Otherwise one of them becomes obsolete
 - High risk of mis-use
 - Loss of trust, wasted resources
- Articulation/modularity via clear interfaces
- e.g. lessons learned for CMIP, ESGF, ES-DOC,...



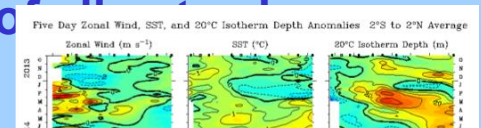
ENSO and tropical Pacific metrics for CMIP6

Eric Guilyardi (IPSL & NCAS/Climate) and Andrew Wittenberg (GFDL)

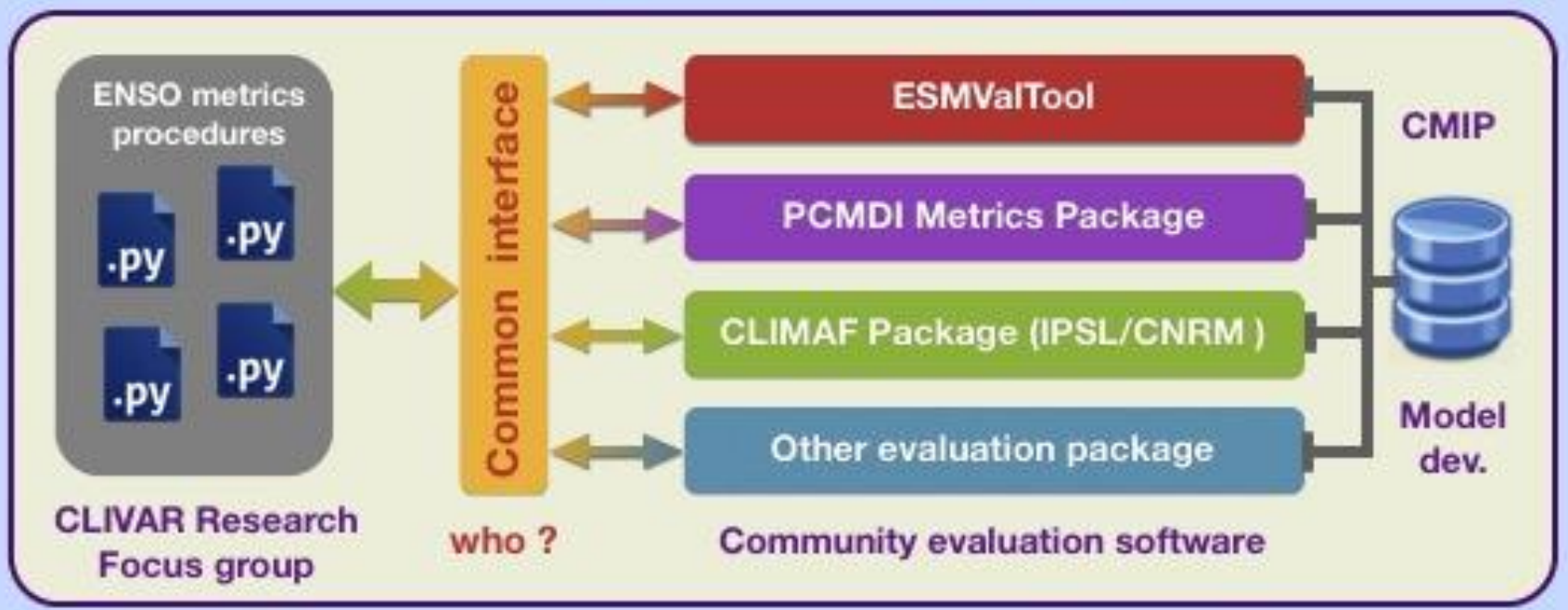
On behalf of the CLIVAR Reseach Focus “ENSO in a changing climate”



- Despite 30 years of progress, ENSO continues to surprise us and challenge our assumptions - It remains a major unsolved climate puzzle
- It is the “elephant in the room” for regional impacts of climate change
- ENSO research very active field
 - diversity of events
 - extremes
 - role of atmosphere



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*CMIP5 workshop
Dubrovnik Oct. 2015*



The climate information users



- What is the scientific question ?
- What are the related metrics? 
- What are the reference “observations” ?



- Introduce concept of a Metric collection (MC) to address one specific science question

	Metric 1	Metric 2	Metric 3	Metric 4	Metric 5...
Collection A					
Collection B					
Collection C					
...					

Software for model evaluation



- How to best compute the metrics (get data, run on computer, visualize,...)
- Challenging project: define workflow, process, development, modularity, agility, beta testing, operational, funding, etc.
- Who has the knowledge for governance/trust?
 - IT and data experts (i.e. NOT climate experts nor users)
 - e.g. ENES, WIP, ESGF, ES-DOC...

Having a go at the separation of concerns for ENSO

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Science / IT interface

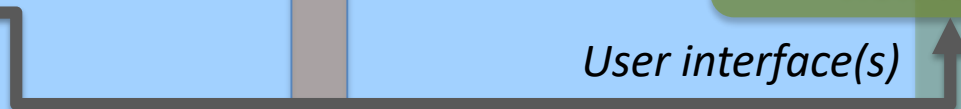
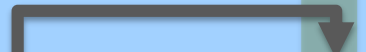
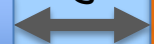
Build software to run metric

Build software to view metric

IT governance

Science question interface

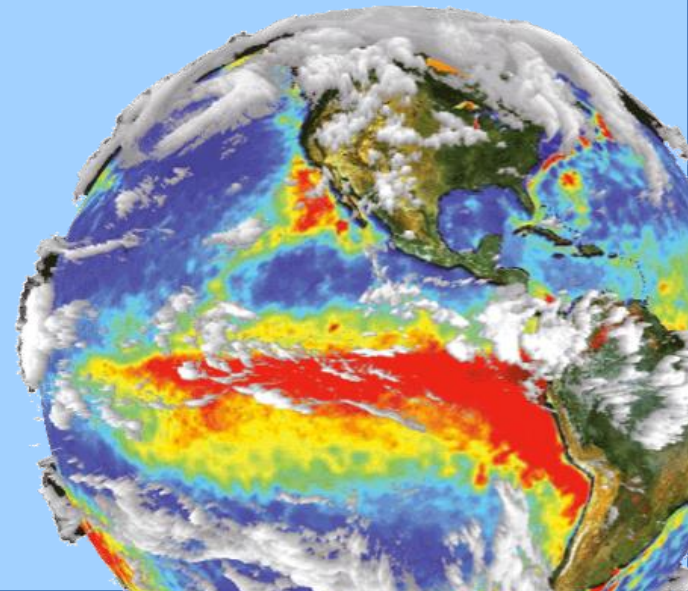
User interface(s)



Work for CLIVAR ENSO experts



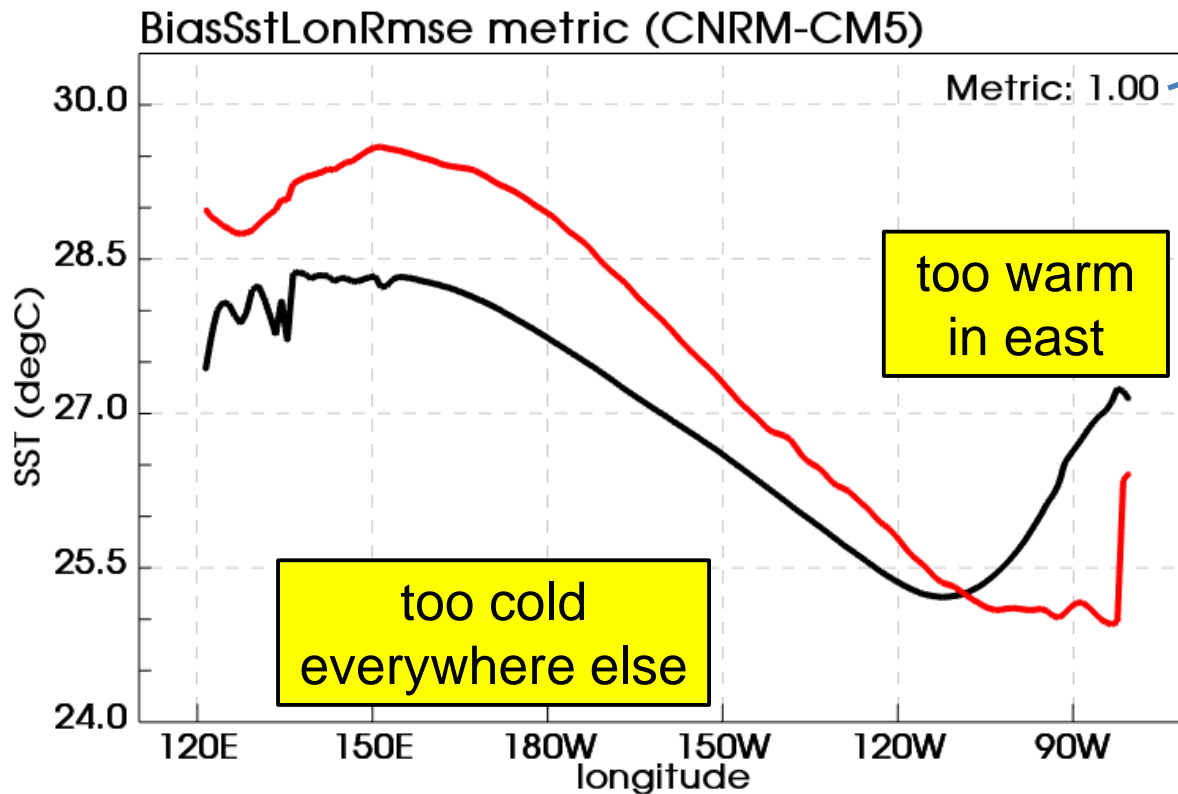
- Identify science questions (performance, 20th century teleconnections, processes, ...)
- Associate a metrics collection to each
- Define metrics (e.g. python files) and associated science choices (reference observation, duration,...)
- Release versions and maintain science contents over time (do not worry about end-to-end technical implementation)
- Document MC and metrics and engage with users



List of science questions

- **ENSO performance in historical simulations**
 - Mean state, seasonal cycle, ENSO characteristics space/time, diversity
- **ENSO teleconnections in historical simulations**
 - Temperature and precipitation, land/ocean regional/global
- **ENSO processes**

Example of metric: annual-mean climate



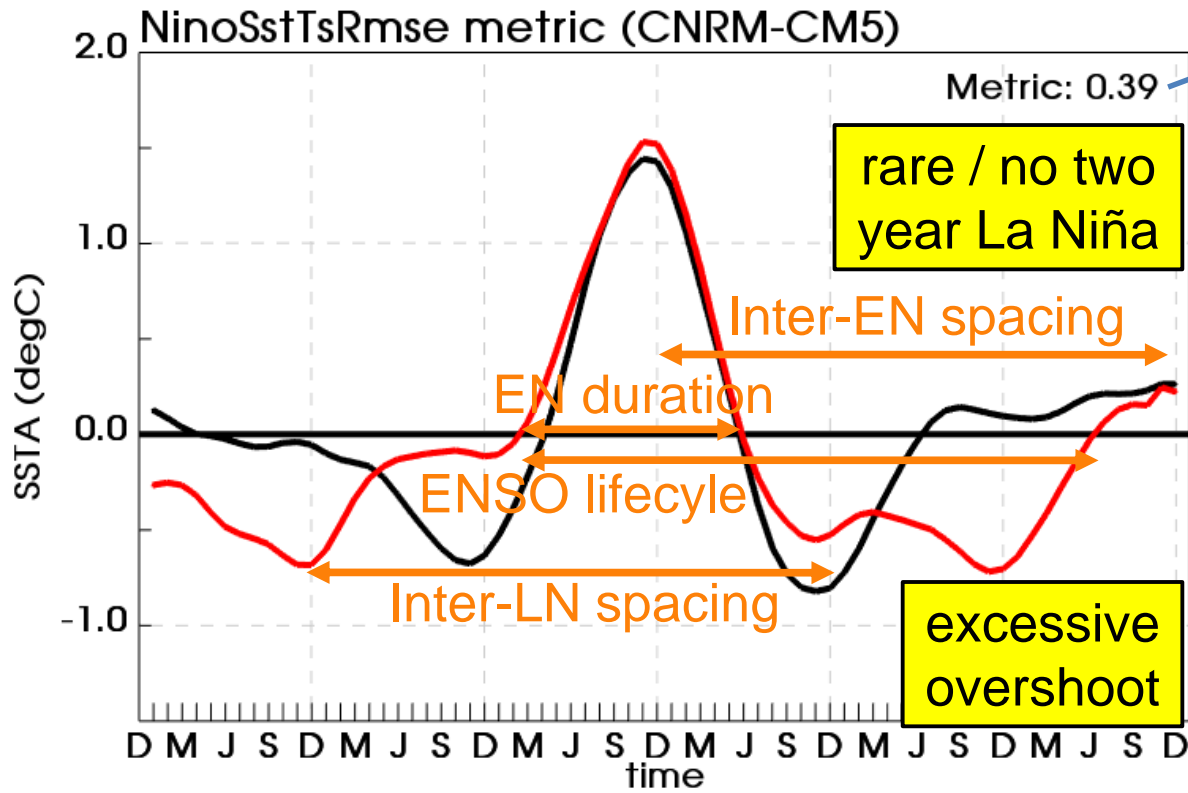
RMSE(obs, model) in °C

Same diagnostics in latitude in the eastern Pacific

Same diagnostics using:

- Taux
- Pr

Example of metric: El Niño life cycle



RMSE(obs, model) in °C

Diagnostic in longitude along the equator for SSTA during ENSO peak

Same diagnostics for La Niña events

Structure of pilot ENSO package

Engage with an IT infrastructure (driver)

ENSO Metrics Package

ENSOCollectionsLib.py

ENSOComputeMetricsLib.py

ENSOMetricsLib.py

ENSO Support libs

Define pre-processing

dict{}

*Documentation of every step in calculation
carried through with the results*

PMP Driver

Understand work
(vars, obs...)

Execute work
(loop on models)

Collect results

View results

*User chooses metric
collection and models*



**Science / IT
interface**

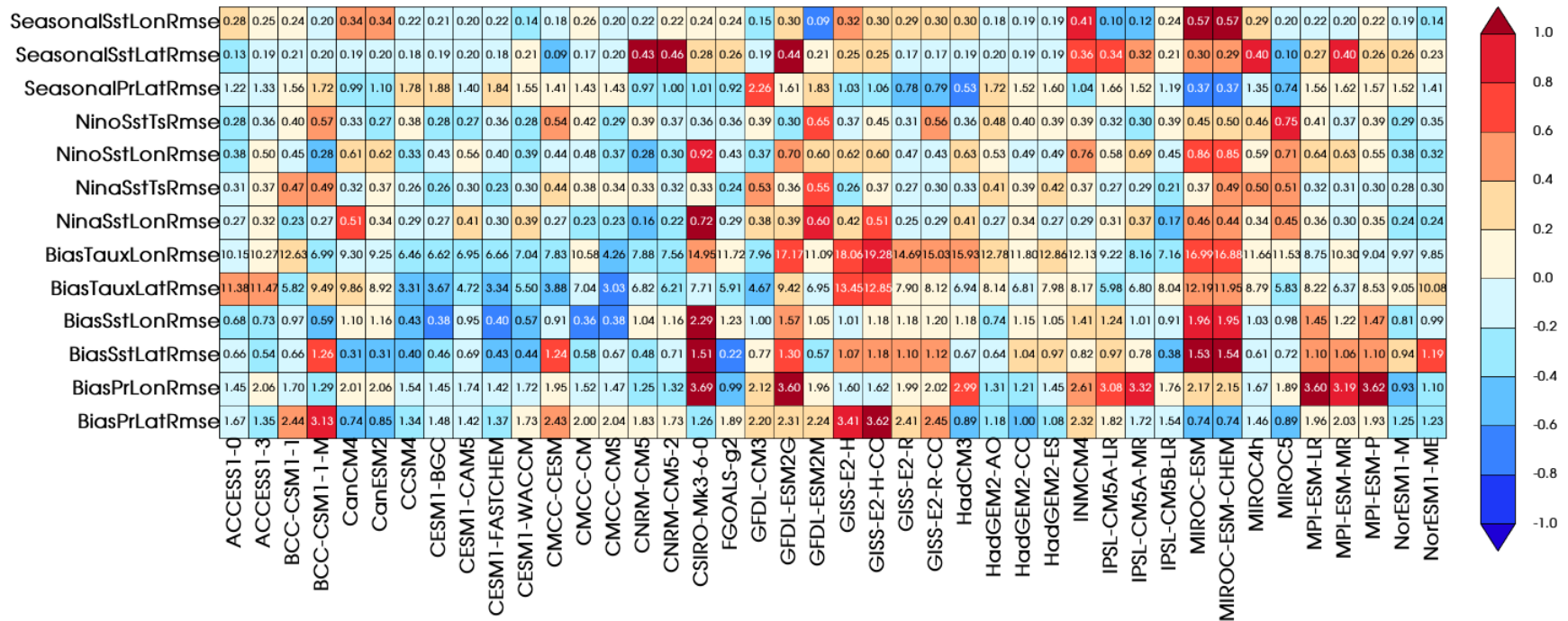
User analyses results



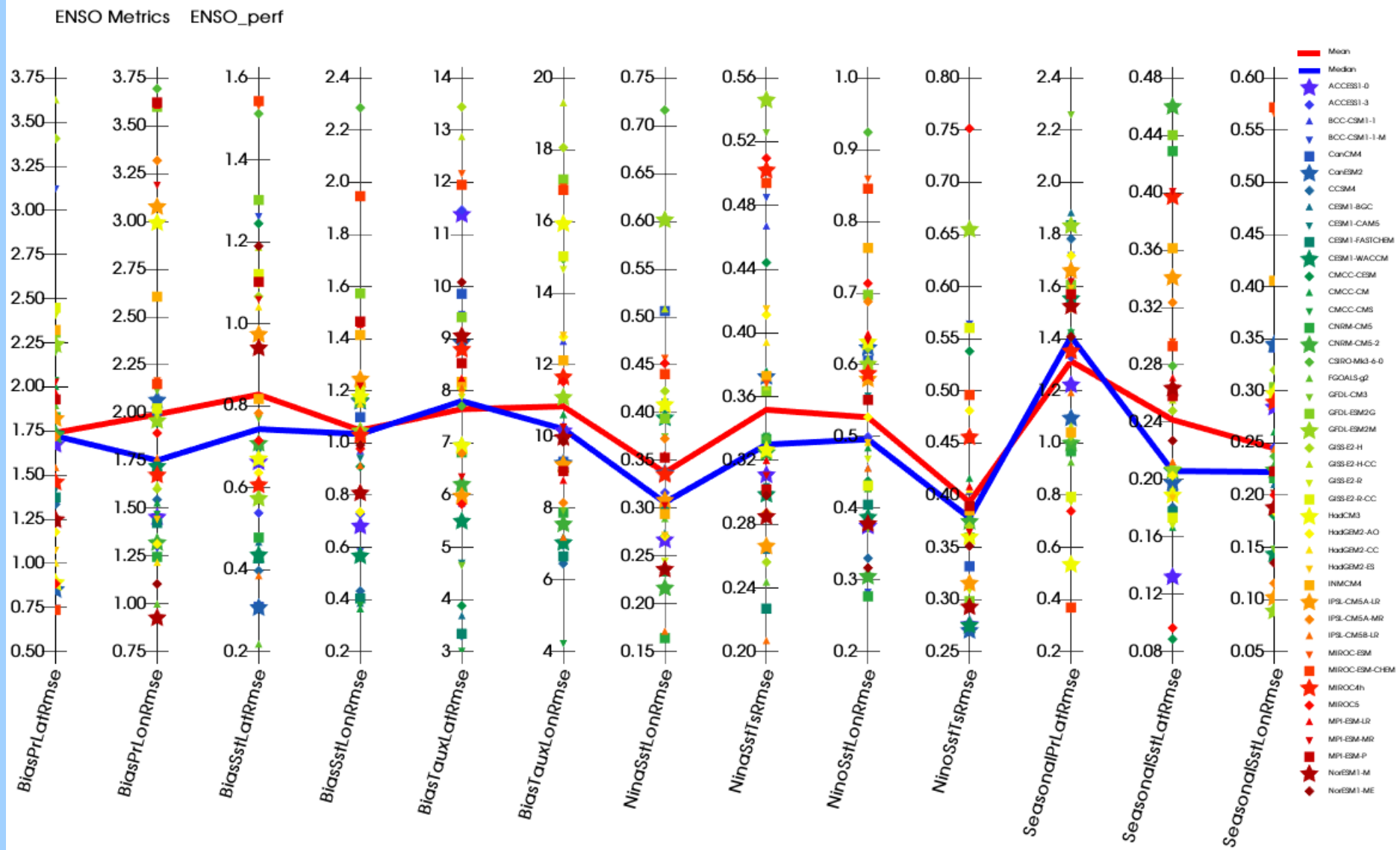
https://github.com/eguil/ENSO_metrics

First results – ENSO performance in CMIP5 historical

Shading : relative performance wrt MME
 Values : actual metric value (here RMSE)



Another view: the parallel plot



Documenting the science provenance

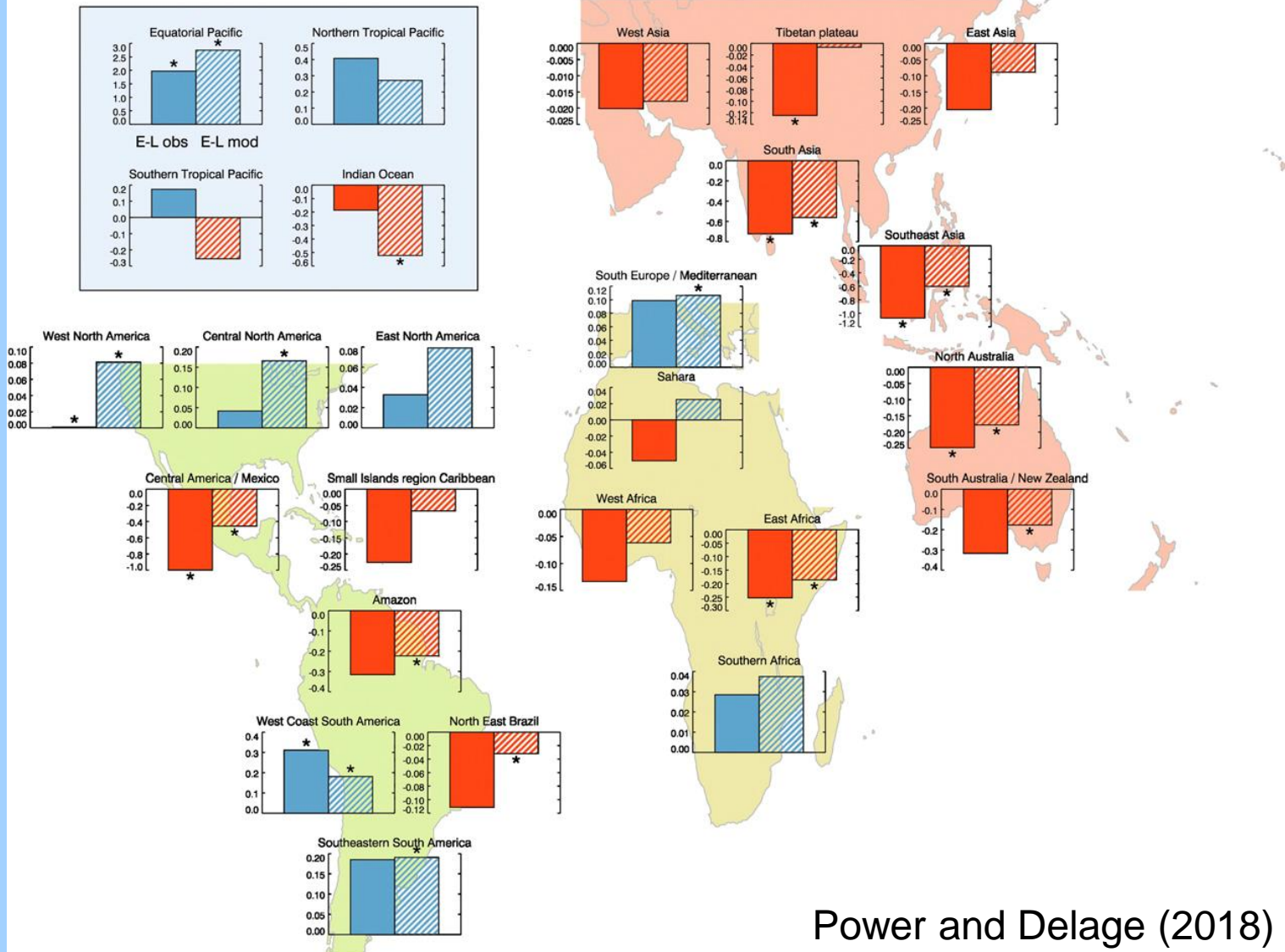
- For each metric, provide:
 - Documentation: whys and hows of the metric Math
 - Definition of the metric
 - Frequency (DA, MO,...)
 - Observations (as many as possible), including ref. period
 - Reference to show the robustness of metric
 - Minimum number of realisations (for metric to make sense)
 - Minimum length of simulation needed (for metric to make sense)
 - « Dive down » diag (map of RMS,...)
 - Normalisation wrt sharing single color bar in a MME env.

ENSO teleconnections

- Evaluation of ENSO-related teleconnection in historical simulations
- 10 metrics proposed :
 - 6 on mean ENSO temperature / precipitation patterns (Perry et al. 2017)
 - 4 on regional ENSO precipitation teleconnection (Power & Delage 2018)

EN minus LN precipitation (JJA)

El Niño - La Niña precipitation composites (JJA)



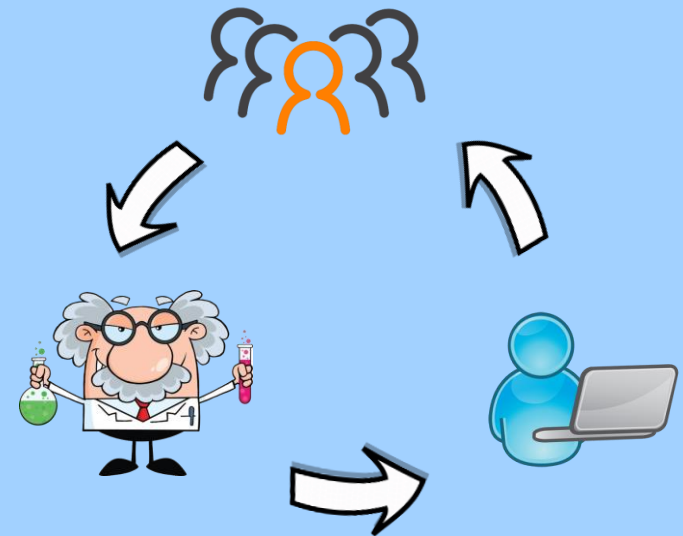
Power and Delage (2018)

Science governance: call for a « WCRP model evaluation panel »

- Need to label consensus model evaluation for community trust
- Like for MIPs proposed by the community, a panel is needed to define quality criteria and label packages
- Criteria should include process, maturity, level of documentation, review etc. maybe following IPCC-like process
- An ad-hoc group would oversee the technical standard for the science provenance (e.g. WIP for WGCM)

Summary - model evaluation

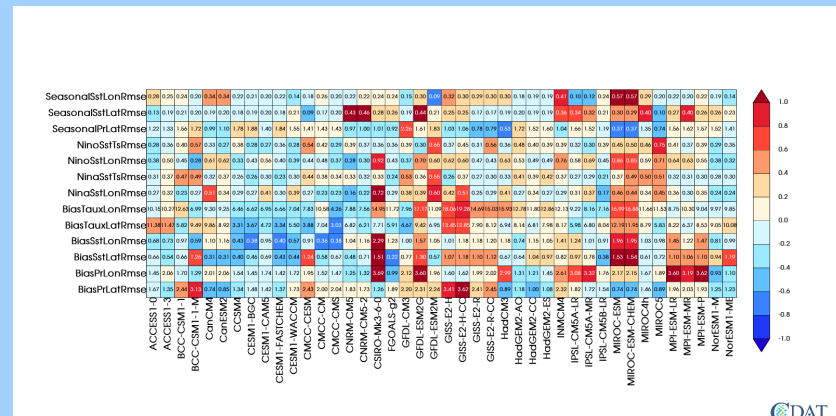
- Evaluating models for uses beyond the climate modelling experts is a new challenge
- Community ready to organise model evaluation to another level, separation of concerns, standards and interfaces
- Governance (end users, WCRP experts, data and software)
- Opportunity with new WCRP strategy and infrastructure projects (e.g. IS-ENES3)



ENSO metrics – stay tuned

Pilot implementation for ENSO metrics

- Contribution to CMIP6/IPCC AR6 evaluation
- Suite of model exploration tools for a wide range of users
- Long lasting contribution of CLIVAR ENSO experts
- Get involved !



**Reducing CO₂ emissions:
what can we do as a
community ?**

Having discovered the issue of climate change and writing IPCC reports is key... but does not preclude actions to reduce emissions

What can we do,
avoiding both too strong
advocacy and denial ?

Act as a community !
For us it means: **less air travel
for scientific meetings**



Could we devise best practice for the climate community ?

E.g:

- Manage a shared carbon budget/emissions targets per team/group
- Favour early career scientists travel
- Influence conference organisation to develop two-way remote participation (give the choice)
- Fund videoconferencing equipment (bandwidth, dedicated rooms, local/regional hubs)
- Offset (only) if travel cannot be avoided

Collective approach allows more long lasting effects, shared values and many co-benefits

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