A brief update on a framework for **Benchmarking Simulated Precipitation in Earth System Models**

Jiwoo Lee¹, Min-Seop Ahn¹, Ana Ordonez¹, Paul Ullrich², Peter Gleckler¹, Christian Jakob³, Angie Pendergrass⁴, Michael Wehner⁵ and additional collaborators

> ¹ PCMDI, Lawrence Livermore National Laboratory ² UC Davis, ³ Monash University, ⁴ Cornell University ⁵ Lawrence Berkeley National Laboratory

- Motivation: Precipitation Metrics Workshop (2019)
- Progress on Benchmarking Simulated Precipitation
- Possible connections with WGNE and WGCM

Joint WGNE/WGCM Session 8-10 November, 2022, Boulder, USA



LLNL-PRES-842184 This work was performed under the auspices of the U.S. Department of Energy by Lawrence Livermore National Laboratory under contract DE-AC52-07NA27344. Lawrence Livermore National Security, LLC The efforts of the authors are supported by the Regional and Global Model Analysis (RGMA) program of the United States Department of Energy's Office of Science.

Benchmarking Simulated Precipitation in Earth System Models

WORKSHOP REPORT



Baseline and exploratory metrics

 A limited set of <u>routine or baseline metrics</u> are being advanced for repeat use benchmarking via development of a quasi-operational capability

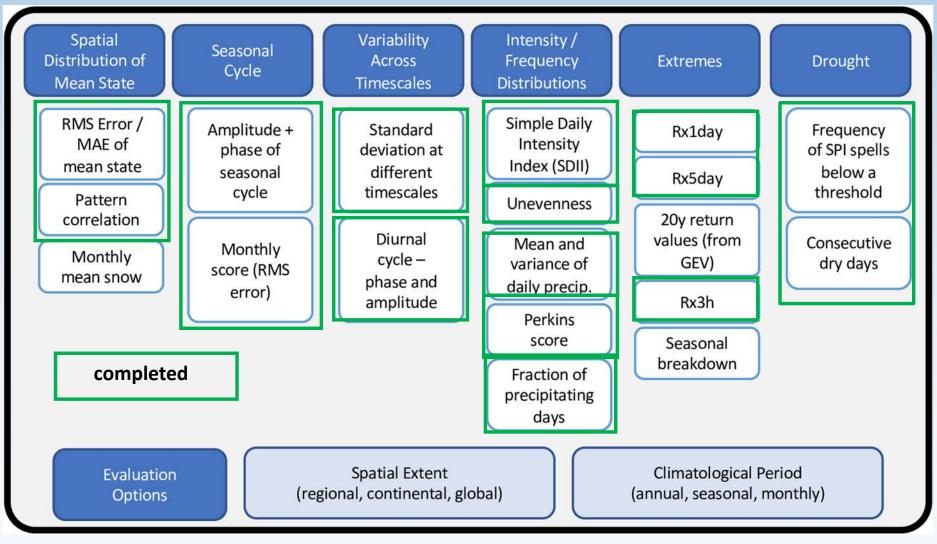
Pendergrass et al., BAMS, 2020 https://doi.org/10.1175/BAMS-D-19-0318.1

• <u>Exploratory metrics</u> are being investigated for a variety of characteristics lacking well-established performance tests (e.g., ARs, TCs)

Leung, R. et al., J. Clim., 2022 <u>https://doi.org/10.1175/JCLI-D-21-0590.1</u>

Several presentations at both WGNE and WGCM sessions in recent years have advocated for a more structured approach to gauging the consistency between observed and simulated precipitation in CMIP class models.

Implementation Progress Precipitation baseline benchmarking





Baseline metrics resulting from precipitation benchmarking workshop (Fig 4).



Example: Benchmarking Precipitation Variability Across Time Scales



Ahn, M. et al., J. Clim, 2022 DOI: 10.1175/JCLI-D-21-0542.1

Applies two independent methods to estimate forced and unforced precip variability at selected scales with demonstrated robustness

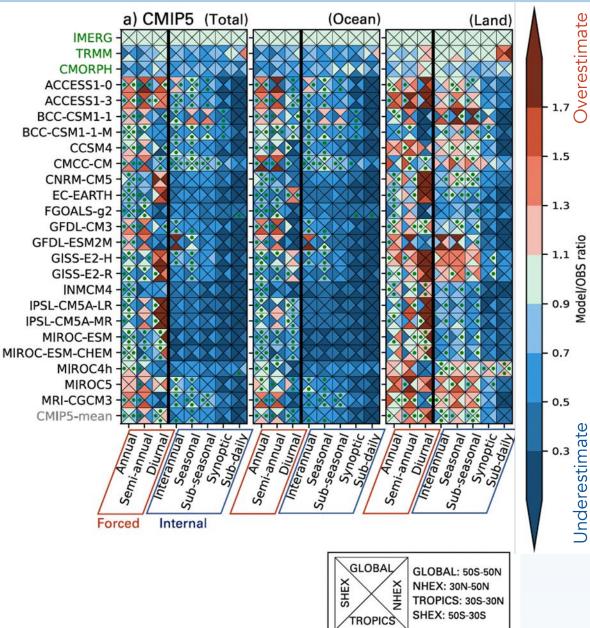
Time scales: subdaily, synoptic, subseasonal, seasonal, and interannual

Domains: global, tropics, extratropics, land, or ocean

Metric: Ratio of simulated to observed variability (VARmod/VARobs)

Multiple satellite based estimates used: IMERG, CMORPH and TRMM

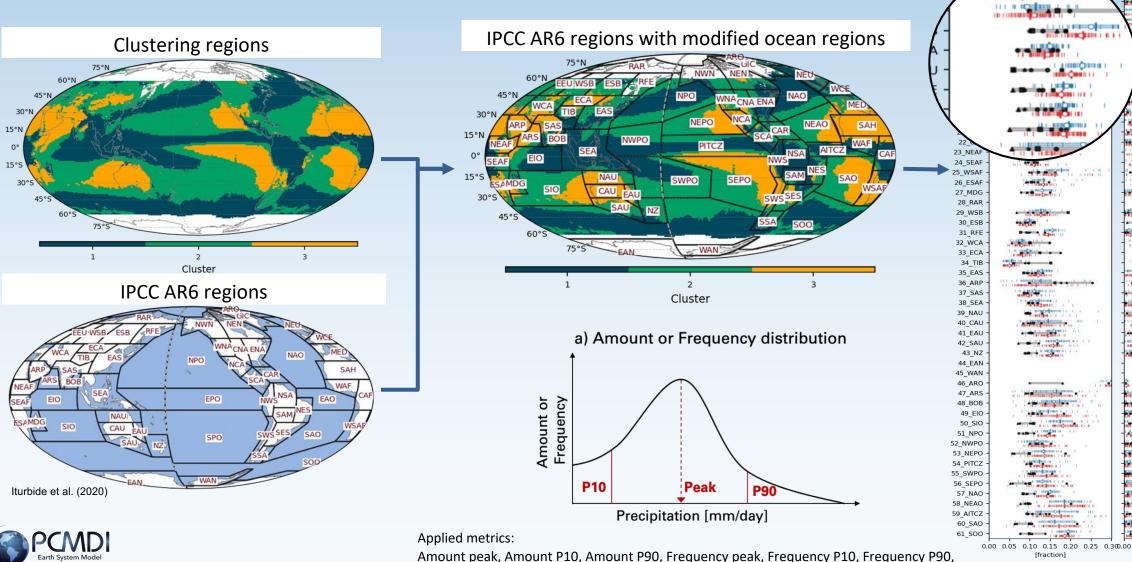
Evidence of systematic muted variability at shorter time scales





Example: Framework for Benchmarking Simulated Precipitation Distribution in Regional Scales

Ahn, M. et al. 2022, GMD (under review)



P10 amount

100

OBS

0 GIC

1 NWN

2_NEN 3_WNA 4 CNA P90 amount

MILLOUGH

No designation

0.05

0.10

[fraction]

0.15

Unevenness, FracPRdays, SDII, and Perkins score

Supporting the benchmarking of simulated precipitation

- Python (xarray-based) analysis software available with interactive demos (Jupyter notebooks) (<u>https://github.com/PCMDI/pcmdi_metrics</u>)
- Linkage to a variety of observational datasets (obs4MIPs compliance)
- Traceable and Reproducible Science: documents versions of all analysis tools, codes and data to facilitate benchmarking
- Results (statistics, archived in JSON files) for simulations contributed to all generations of CMIP and AMIP being made available via Github repo <u>https://github.com/PCMDI/pcmdi_metrics_results_archive</u>









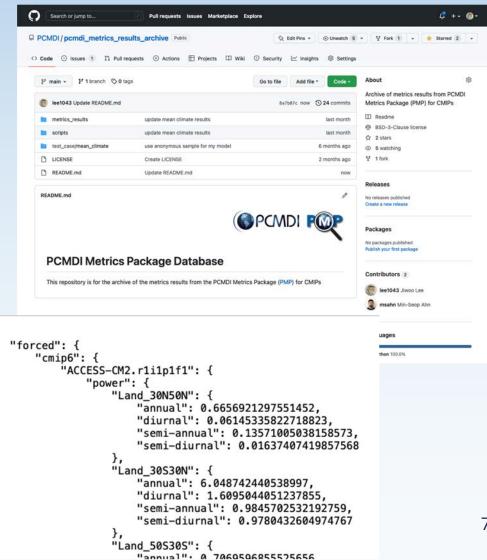
Example use of the archived precipitation benchmarking results

Interested parties can apply the benchmarking software to their own simulations, and/or exploit the archived results of other CMIP and AMIP simulations.

PCMDI is using the archived results to provide interactive summary graphics with access to the underlying diagnostics from which the metrics were calculated.



https://github.com/PCMDI/pcmdi metrics results archive



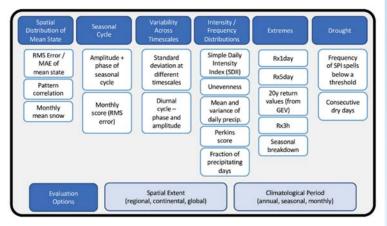


PCMDI "Dive-down" example

Program for Climate Model Diagnosis & Intercomparison EXMANCED BY Google C Home About* Research* CMIP6* MIPs* Publications* Software* CMIP Data (ESGF Portal) Research > Metrics > Benchmarking Simulated Procipitation CMIP Data (ESGF Portal) CMIP Data (ESGF Portal) CMIP Data (ESGF Portal)

Benchmarking Simulated Precipitation

Welcome to the results site for benchmarking simulated precipitation in Earth System Models (ISBM) This effort has been inspired by the outcomes of a July 2019 DOE workshop (Pendergrass, et al., 2019). That workshop was motivated by discussions that have taken place in recent years in various working groups of the WORP including the Working Group on Numerical Experimentation (WGNE) and Working Group on Coupled Models (WGCM). This site was initially made public 2020/10/10 and will be regularly updated as our efforts advance, so check back here soon to see progress.



Spatial Distribution of Mean State

Taylor diagrams of spatial distribution (CMIP6-histotical)

Seasonal Cycle

- Line graph of domain averaged seasonal cycle with monthly mean (CMIP6-histotical)
- Bar chart of RMS and RMSC for the seasonal cycle (CMIP6-histotical)

Variability Across Timescales (from Sub-daily to Interannual)

- Standard deviation at different timescales
- Bar chart of domain averaged STD (CMIP6-histotical)
- Bar chart of domain averaged STD (CMIP5-histotical)
 Portrait chart of domain averaged STD (CMIP6-histotical)
- Portrait chart of domain averaged STD (CMIP6-histotical)
 Portrait chart of domain averaged STD (CMIP6-histotical)

- Spectral power at different timescales

Portrait chart of domain and frequency averaged spectral power (CMIP6-histotical)
 Portrait chart of domain and frequency averaged spectral power (CMIP5-histotical)

https://pcmdi.llnl.gov/research/metrics/precip/

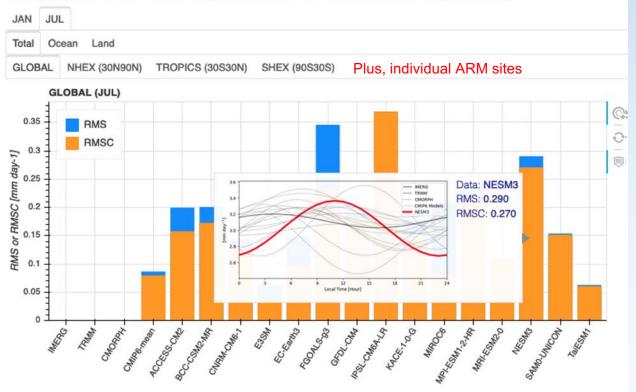


RMS and RMSC for domain averaged diurnal cycle (first harmonic) of CMIP6 models

RMS: root-mean-square difference

RMSC: centered pattern RMS (Taylor 2001)

Reference data for RMS and RMSC: IMERG (TRMM and CMORPH are not available for extratropical domains)





PCMDI "Dive-down" example

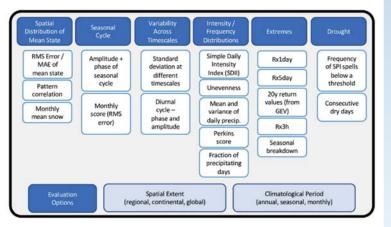
 Program for Climate Model Diagnosis & Intercomparison
 EXMANCED BY Google
 Q

 Home
 About*
 Research*
 CMIP6*
 MIPs*
 Publications*
 Software*
 CMIP Data (ESGF Portal)

 Research > Metrics > Benchmarking Simulated Precipitation

Benchmarking Simulated Precipitation

Welcome to the results aite for benchmarking simulated precipitation in Earth System Models (ESMs) This effort has been inspired by the outcomes of a July 2019 DOE workshop (Pendergrass, et al., 2019). That workshop was motivated by discussions that have taken place in recent years in various working groups of the WCRP including the Working Group on Numerical Experimentation (WGNE) and Working Group on Coupled Models (WGCM). This site was initially made public 2020/10/10 and will be regularly updated as our efforts advance, so check back here soon to see progress.



Spatial Distribution of Mean State

Taylor diagrams of spatial distribution (CMIP6-histotical)

Seasonal Cycle

- Line graph of domain averaged seasonal cycle with monthly mean (CMIP6-histotical)
- Bar chart of RMS and RMSC for the seasonal cycle (CMIP6-histotical)

Variability Across Timescales (from Sub-daily to Interannual)

- Standard deviation at different timescales
- Bar chart of domain averaged STD (CMIP6-histotical)
- Bar chart of domain averaged STD (CMIP5-histotical)
- Portrait chart of domain averaged STD (CMIP6-histotical)
 Portrait chart of domain averaged STD (CMIP5-histotical)

- Spectral power at different timescales

Portrait chart of domain and frequency averaged spectral power (CMIP6-histotical)
 Portrait chart of domain and frequency averaged spectral power (CMIP5-histotical)

https://pcmdi.llnl.gov/research/metrics/precip/

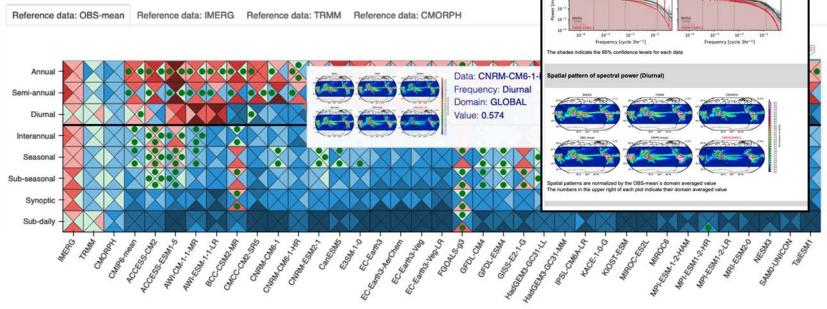
PCMD Earth System Model Evaluation Project

[Go to CMIP5]

Precipitation Variability across Timescales (CMIP6)

Metric: Model/Reference ratio of spectral power

Domains in four-way triangles: Global(50S-50N, Top), NHEX(30N-50N, Right), TROPICS(30S-30N, Bottom), SHEX(50S-30S, Li Green dots indicate that models's metric value is in between observational range





Precipitation Variability across Timescales

Dive Down Diagnostics

Power spectra (GLOBAL)

Model: CNRM-ESM2-Frequency: Diurnal Domain: GLOBAL Metric value: 0.636

1.3

-1.1

-0.9

-0.5

-0.3

Current status and potential uses



- A complete version expected early in 2023, but interested parties can use now via the PCMDI Metrics Package (PMP, <u>https://github.com/PCMDI/pcmdi_metrics</u>) or CMEC (<u>https://cmec.llnl.gov/</u>) driver.
- Can assist modelers in gauging improvements in simulated precipitation
- Results for AMIP and CMIP (historical) simulations will continue to be made available with performance changes documented across model versions
- Will be used to reproducibly document model improvements over time
- With a framework for v1.0, contributions and collaborations are welcome for the future!



Coordinated Model Evaluation Capabilities

- CMEC is an effort to bring together a diverse set of analysis packages that have been developed to evaluate Earth System Models (ESMs) under a single, robust set of standards.
- CMEC allows contributors to more easily distribute their evaluation tools to the broader community, and for users to more easily run a suite of evaluation tools from a single command line (coordinated execution).
- Focused on community-oriented development.
- More information here: <u>https://cmec.llnl.gov</u>





Some CMEC Compatible Packages PCMDI Metrics Package (PMP) ILAMB / IOMB SPI Drought Metrics Coastal Storms Metrics Scales of Precipitation (ASoP) Water Mass Balance (xWMT) Model Diagnostic Task Force (MDTF) Process-Oriented Diagnostics

