ClimateBench v1.0: A benchmark for data-driven climate projections

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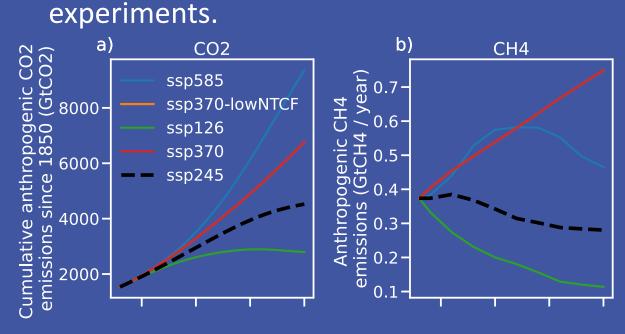
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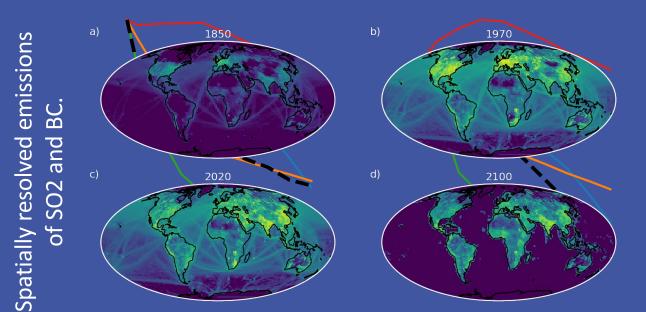
INTRODUCTION

- It is impractical to use fully-coupled Earth system models to fully explore all possible future emission pathways.
- ClimateBench the first benchmarking framework based on a suite of state-of-theart simulations performed by a full complexity Earth System Model (ESM),
- Including a set of baseline machine learning models that emulate temperature and precipitation (including extreme precipitation) to a variety of forcers (carbon dioxide, methane and aerosols).

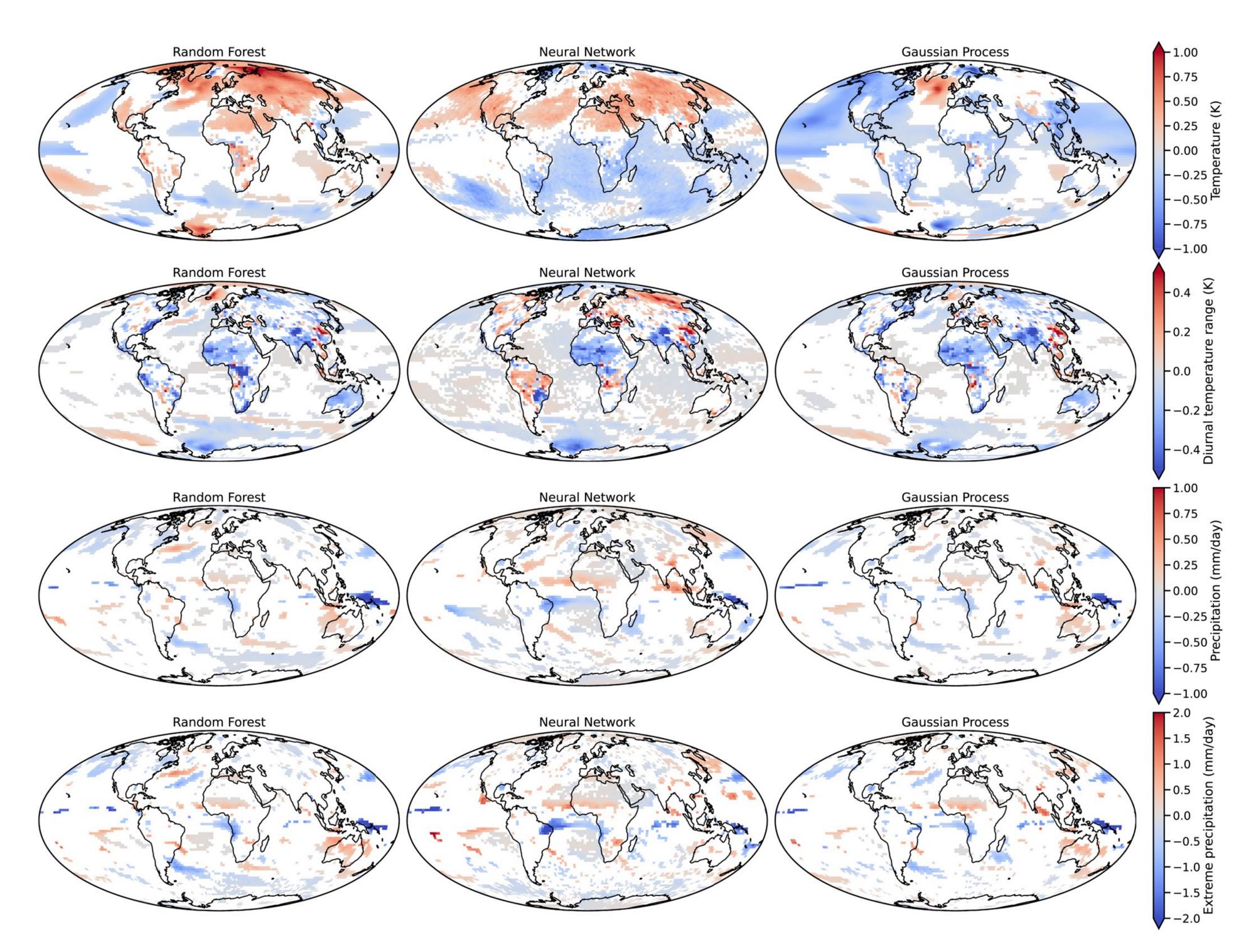
DATA & WORKFLOW

• Input: Emission data from historical, ScenarioMIP, DAMIP & AerChemMIP





Data-driven climate projections could enable exploration of climate responses given a wide range of emissions scenarios using efficient emulator of Earth system models.







*This work is a result from the jointed virtual hackathon between 3rd NOAA AI Workshop and Climate Informatics.

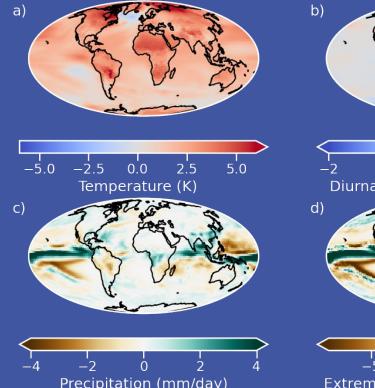


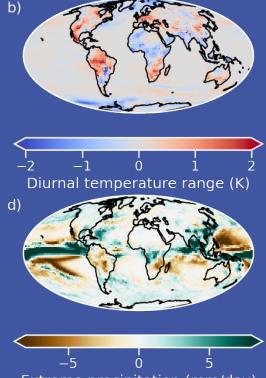
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DATA & WORKFLOW

• **Output**: NorESM2 temperature and precipitation simulations.





EVALUATION METRICS

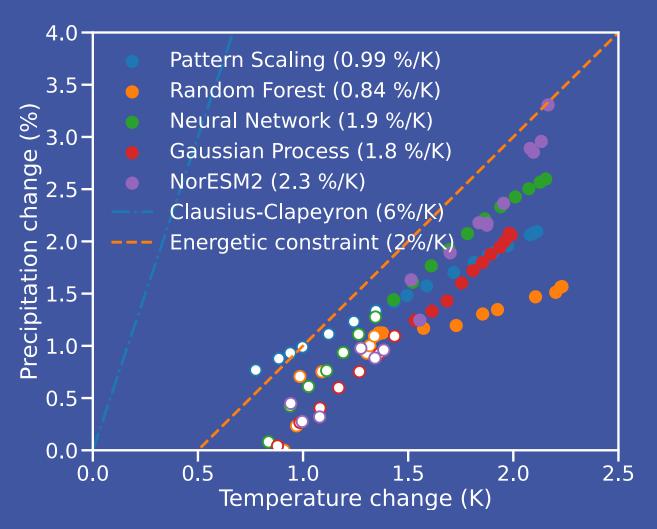
• The target evaluation metric is a combination of the RMSE over the spatial and global mean scales, $NRMSE_t$:

$$NRMSE_{s} = \sqrt{\left\langle \left(\left| x_{i,j,t} \right|_{t} - \left| y_{i,j,t,n} \right|_{n,t} \right)^{2} \right\rangle / \left| \left\langle y_{i,j} \right\rangle \right|_{t,n}}$$
$$NRMSE_{g} = \sqrt{\left| \left(\left\langle x_{i,j,t} \right\rangle - \left\langle \left| y_{i,j,t,n} \right|_{n} \right\rangle \right)^{2} \right|_{t} / \left| \left\langle y_{i,j} \right\rangle \right|_{t,n}}$$

 $NRMSE_t = NRMSE_s + \alpha * NRMSE_g$,

DISCUSSION

• All emulators broadly respect global conservation of energy in global mean precipitation change, but that the RF and Pattern scaling baseline significantly underpredict the hydrological sensitivity.



• Future work is embedding physical constraints into hybrid models to allow improved accuracy, robustness and generalisability, and ultimately trust.