Supplement of: Selecting a climate model subset to optimise key ensemble properties

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1 CMIP5 model runs used in this study

Table S1. The CMIP5 model runs used in this study.

Institute ID	Modeling Center (or Group)	Model Name	Ensemble Member
CSIRO-BOM	Commonwealth Scientific and Industrial Research Organization (CSIRO) and Bureau of Mete-	ACCESS1.0	rlilpl
	orology (BOM), Australia		
Dee		ACCESS1.3	
всс	Beijing Climate Center, China Meteorological Administration	BCC-CSM1.1-m	r111p1
0.0000		BCC-CSMI.I	r111p1
GCESS	College of Global Change and Earth System Science, Beijing Normal University	BNU-ESM	
NCAR	National Center for Atmospheric Research, USA	CCSM4	rilipi, r2lipi, r3lipi, r4lipi, r3lipi, r6lipi
NSF-DOE-NCAR	National Science Foundation, Department of Energy, NCAR, USA	CESM-BGC	
C 1 C C		CESMI-CAM5	r111p1, r211p1, r311p1
CMCC	Centro Euro-Mediterraneo per I Cambiamenti Climatic, Italy	CMCC-CMS	rlilpl
		CMCC-CM	rlilpl
CNRM-CERFACS	Centre National de Recherches Météorologiques / Centre Européen de Recherche et Formation	CNRM-CM5	rlilpl
CSIRO-QCCCE	Commonwealth Scientific and Industrial Research Organization in collaboration with Queens- land Climate Change Centre of Excellence, Australia	CSIRO-Mk3.6.0	rlilpl, r2ilpl, r3ilpl, r4ilpl, r5ilpl, r6ilpl, r7ilpl, r8ilpl, r9ilpl, r10ilpl
CCCMA	Canadian Centre for Climate Modelling and Analysis, Canada	CanESM2	rlilpl, r2ilpl, r3ilpl, r4ilpl, r5ilpl
EC-EARTH	EC-EARTH consortium	EC-EARTH	r2i1p1, r8i1p1, r9i1p1, r12i1p1
LASG-CESS	LASG, Institute of Atmospheric Physics, Chinese Academy of Sciences, China	FGOALS-g2	rlilpl
FIO	The First Institute of Oceanography, SOA, China	FIO-ESM	rlilpl, r2ilpl, r3ilpl
NOAA GFDL	NOAA Geophysical Fluid Dynamics Laboratory, USA	GFDL-CM3	rlilpl
		GFDL-ESM2G	rlilpl
		GFDL-ESM2M	rlilpl
NASA GISS	NASA Goddard Institute for Space Studies, USA	GISS-E2-H-CC	rlilpl
		GISS-E2-H	rlilpl, rlilp2, rlilp3, r2ilp1, r2ilp3
		GISS-E2-R-CC	rlilpl
		GISS-E2-R	rlilpl, rlilp2, rlilp3, r2ilp1, r2ilp3
NIMR/KMA	National Institute of Meteorological Research/ Korea Meteorological Administration, Korea	HadGEM2-AO	rlilpl
MOHC	Met Office Hadley Centre, UK	HadGEM2-CC	rlilpl
		HadGEM2-ES	rlilpl, r2ilpl, r3ilpl, r4ilpl
INM	Institute for Numerical Mathematics, Russia	INM-CM4	rlilpl
IPSL	Institut Pierre-Simon Laplace, France	IPSL-CM5A-LR	rlilpl, r2ilpl, r3ilpl, r4ilpl
		IPSL-CM5A-MR	rlilpl
		IPSL-CM5B-LR	rlilpl
MIROC	Japan Agency for Marine-Earth Science and Technology, Atmosphere and Ocean Research In- stitute (The University of Tokyo), and National Institute for Environmental Studies, Japan	MIROC-ESM-CHEM	rlilpl
		MIROC-ESM	rlilpl
		MIROC5	rlilpl, r2ilpl, r3ilpl
MPI-M	Max Planck Institute for Meteorology, Germany	MPI-ESM-LR	rlilpl, r2ilpl, r3ilpl
		MPI-ESM-MR	rlilpl
MRI	Meteorological Research Institute, Japan	MRI-CGCM3	rlilpl
NCC	Norwegian Climate Centre	NorESM1-ME	rlilpl
		NorESM1-M	rlilpl

2 Gridded observational products

Table S2. Information about the observational and reanalysis products used in this study. tas: Surface air temperature, pr: Total precipitation. The overlapping period 1956–2013 was used for all the products. If two resolutions are given, then the first refers to the resolution the product comes in and the second resolution is the one it is regridded to.

Product Name	Variable	Coverage	Resolution	Link	References
CRUTEM4	tas	land-only	5°	http://www.metoffice.gov.uk/hadobs/ crutem4/index.html	Jones, P. D., Lister, D. H., Osborn, T. J., Harpham, C., Salmon, M., and Morice, C. P.: Hemispheric and large-scale land-surface air temperature variations: An extensive revision and an update to 2010, J. Geophys. Res. Atmos., 117(D5), doi:10.1029/2011JD017139, 2012.
Berkeley BEST	tas	land-only and land+ocean	1° / 2.5°	http://berkeleyearth.org/data/	 Rohde R., Muller, R. A., Jacobsen, R., Muller, E., Perlmutter, S., Rosenfeld, A., Wurtele, J., Groom, D., and Wickham, C.: A New Estimate of the Average Earth Surface Land Temperature Spanning 1753 to 2011, Geoinformatics and Geostatistics: An Overview, 1(1), doi:10.4172/2327-4581.1000101, 2013. Rohde, R., Muller, R., Jacobsen, R., Perlmutter, S., Rosenfeld, A., Wurtele, J., Curry, J., Wickham, C., and Mosher, S.: Berkeley Earth Temperature Averaging Process, Geoinformatics and Geostatistics: An Overview, 1(2), doi:10.4172/2327-4581.1000103, 2013. Levi, B. G.: Earth's land surface temperature trends: A new approach confirms previous results, Phys. Today, 66(4), 17, doi:10.1063/PT.3.1936, 2013.
CRU TS (v3.23)	tas, pr	land-only	0.5° / 2.5°	https://crudata.uea.ac.uk/cru/data/hrg/cru_ ts_3.23/	Harris, I., Jones, P. D., Osborn, T. J. and Lister, D. H.: Updated high- resolution grids of monthly climatic observations — the CRU TS3.10 Dataset, Int. J. Climatol., 34(3), 623–642, doi:10.1002/joc.3711, 2014.
HadCRUT4	tas	land+ocean	5°	http://www.metoffice.gov.uk/hadobs/ hadcrut4/	Morice, C. P., Kennedy, J. J., Rayner, N. A., and Jones, P. D.: Quanti- fying uncertainties in global and regional temperature change using an ensemble of observational estimates: The HadCRUT4 dataset, J. Geo- phys. Res. Atmos., 117(D8), doi:10.1029/2011JD017187, 2012.
GPCC (v7)	pr	land-only	2.5°	http://www.esrl.noaa.gov/psd/data/gridded/ data.gpcc.html	Schneider, U., Becker, A., Finger, P., Meyer-Christoffer, A., Rudolf, B., and Ziese, M.: GPCC Full Data Reanalysis Version 7.0 at 2.5°: Monthly Land-Surface Precipitation from Rain-Gauges built on GTS-based and Historic Data, doi: 10.5676/DWD GPCC/FD_M_V7_250, 2015.
PREC/L	pr	land-only	2.5°	http://www.esrl.noaa.gov/psd/data/gridded/ data.precl.html	Chen, M., Xie, P., Janowiak, J. E., and Arkin, P. A.: Global land precipitation: A 50-yr monthly analysis based on gauge observations, J. Hydrometeorol., 3(3), 249–266, doi:0.1175/1525- 7541(2002)003<0249:GLPAYM>2.0.CO;2, 2002.

3.1 For all available runs



Figure S1. Same as Figure 1 (a) but for different observational products.





Figure S2. Same as Figure 1 (b) but for different observational products.

a - Surface Air Temperature



Figure S3. Same as Figure 1 but for 21 model simulations (one simulation per institute to manually remove obvious duplicates) instead of all available model simulations. The horizontal dotted line refers to the multi-model mean of 21 simulations.



Figure S4. Same as Figure 2 but for one model run per institute.



Figure S5. For each of the 81 model simulations, the linear trends in 1956–2005 and 2051–2100 were calculated and plotted against each other. This was done separately for RCP4.5 (light blue) and RCP8.5 (dark blue). The correlation coefficients and regression equations are given on the plot. The trend was calculated based on the data availability of CRUTS3.23 (small map in bottom right corner).



RMSE Improvement for Precipitation, 1 Member per Institute (CRUTS323)

In-Sample (1956-2013)

9 10 11 12 13 14 15 16 17 18 19 20

Out-of-Sample: RCP8.5 (2071-2100)

60

40

20

-20

-40

-60

RMSE Improvement [%] 0

a - Time Series



Subset size (K)

Figure S6. Same as Figure 4 but for precipitation.

7

8

Subset size (K)

1 2 3 4 5 6

b - Climatology

60

40

RMSE Improvement for Precipitation, 1 Member per Institute (CRUTS323)

a - Time Series



Figure S7. Same as Figure 6 but for precipitation.

b - Climatology











Figure S8. Magnitude of the three terms of the objective function in equation (2). The results for five different observational products of surfae air temperature is shown. The meaning of the terms is described in section 4.1.

a - GPCC7

b - PREC/L





Figure S9. Same as Figure S8, but for total precipitation.