

Land evapotranspiration in reanalyses

Comparisons to observations-based datasets, land-surface models and IPCC simulations

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With contributions from the LandFlux-EVAL team

Outline

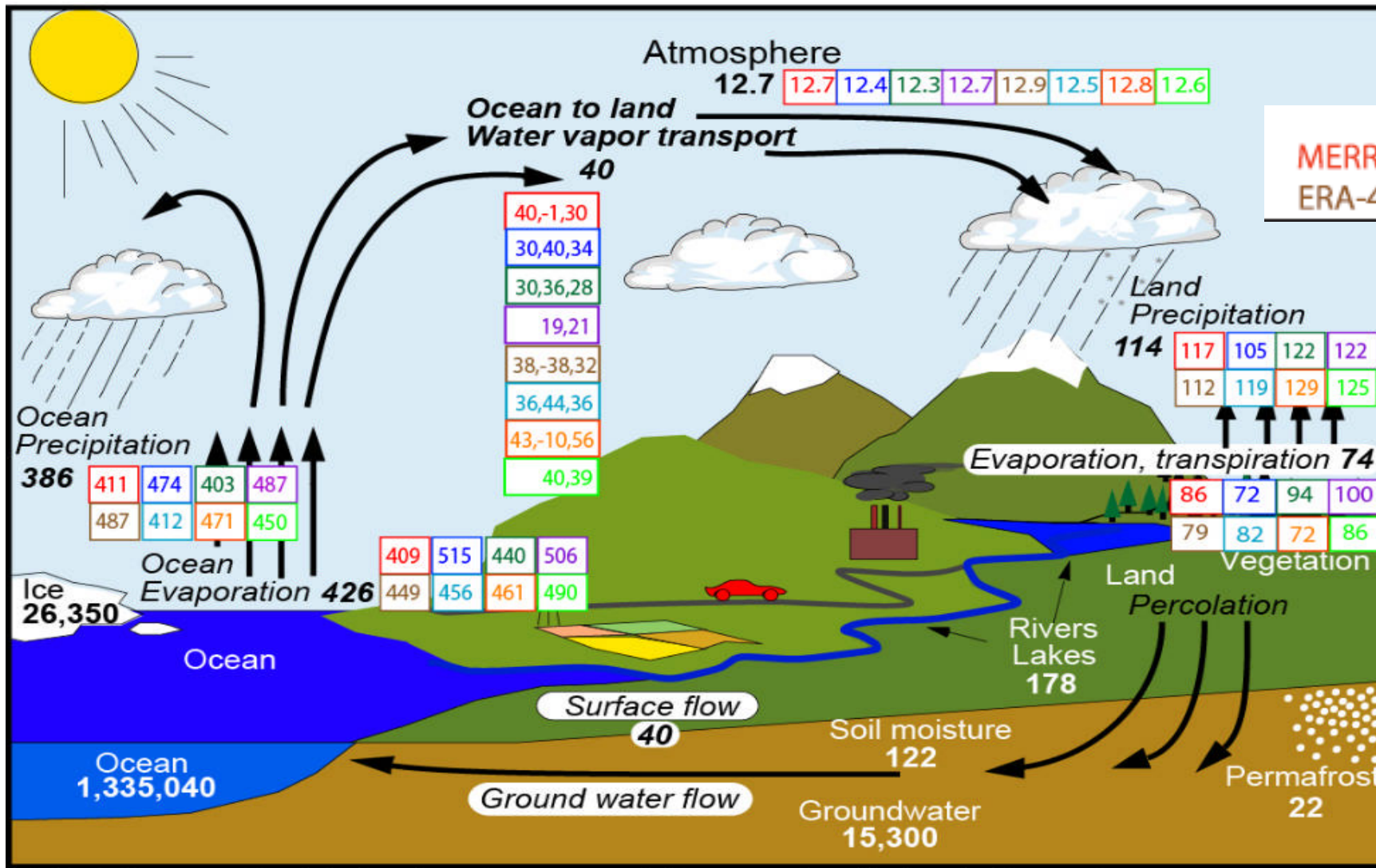
1. Evapotranspiration in reanalyses
2. Global analysis of land-atmosphere coupling
(2m-air temperature from reanalyses)

Motivation

Evapotranspiration (ET) important because of:

- Hydrology and water resources
- Link to other variables of the hydrological cycle (soil moisture, precipitation...) and carbon cycle
- Land-atmosphere feedback and seasonal prediction
- Large uncertainties

The hydrological cycle



	MERRA	JRA	R1	R2
ERA-40*	12.7	12.4	12.3	12.7
ERA-I	12.9	12.5	12.8	12.6
CFSR	40	40	36	43
C20R	40	39	32	39

Large uncertainties

Units: Thousand cubic km for storage, and thousand cubic km/yr for exchanges *1990s

Trenberth et al. J. Climate, 2011

ET in reanalyses

	Land-surface scheme	Characteristics
ERA-Interim	TESSEL	
MERRA	GEOS-5 Catchment LSM	
MERRA-Land	See MERRA, with changes in interception and snow parameters	Off-line replay of MERRA Precipitation forcing corrected with GPCP (newer version with CPC-un)
CFSR-NCEP	NOAH	Observed precipitation (GLDAS)
NCEP (NCAR)	OSU LSM	
JRA-25	Simple Biosphere (SiB) model	

ET dataset categories

- **Diagnostic datasets:**
Based on observations (satellite, Fluxnet etc.)
- **Land-surface models:**
Models driven with observation-based forcing
- **Reanalysis products:**
Models with assimilation of observations
- **Climate models:**
IPCC CMIP3 and CMIP5 global climate model simulation

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Reference
datasets

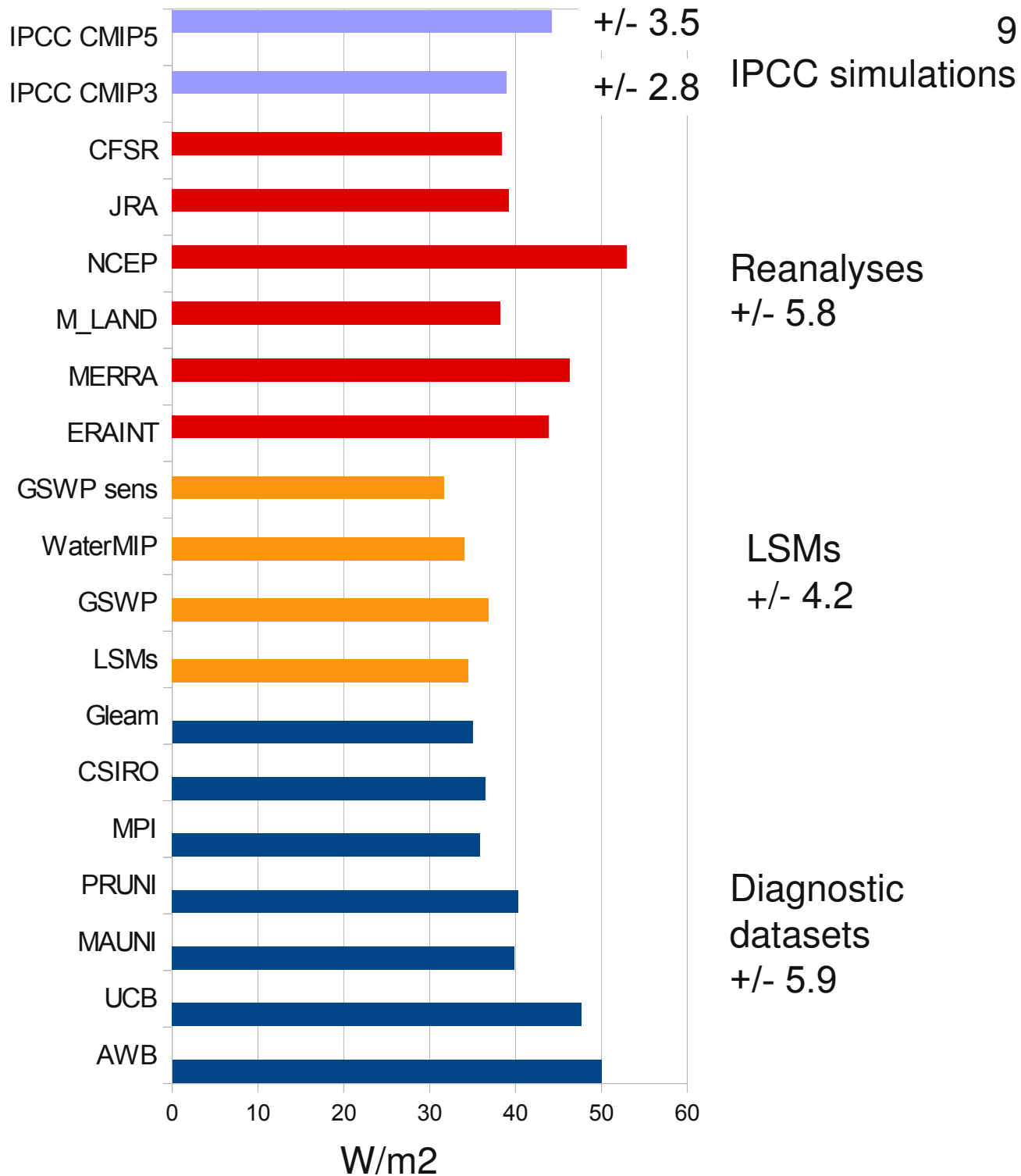
ET evaluation: Research questions

- How well do the reanalyses perform compared to other datasets?
- Are there large differences between IPCC CMIP3 and CMIP5 models?
- What is the influence of forcing on ET?
- Trends in ET?

Global land ET means

1989-1995

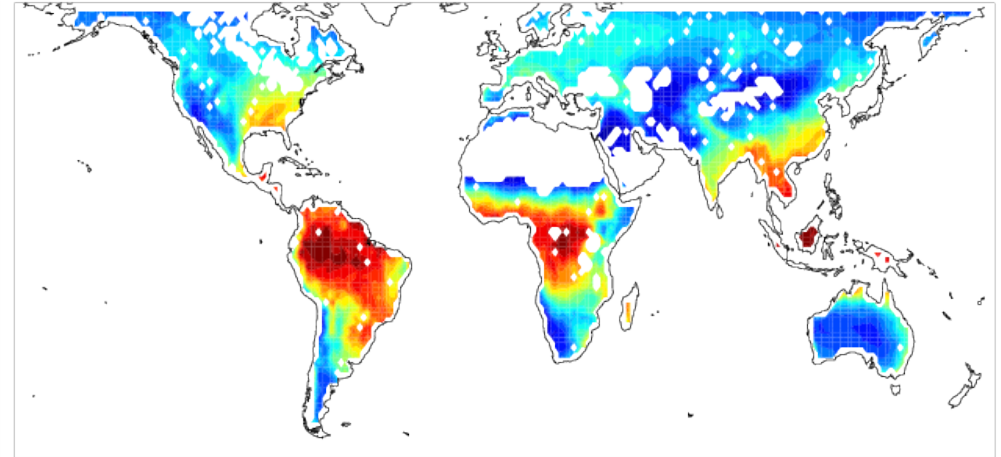
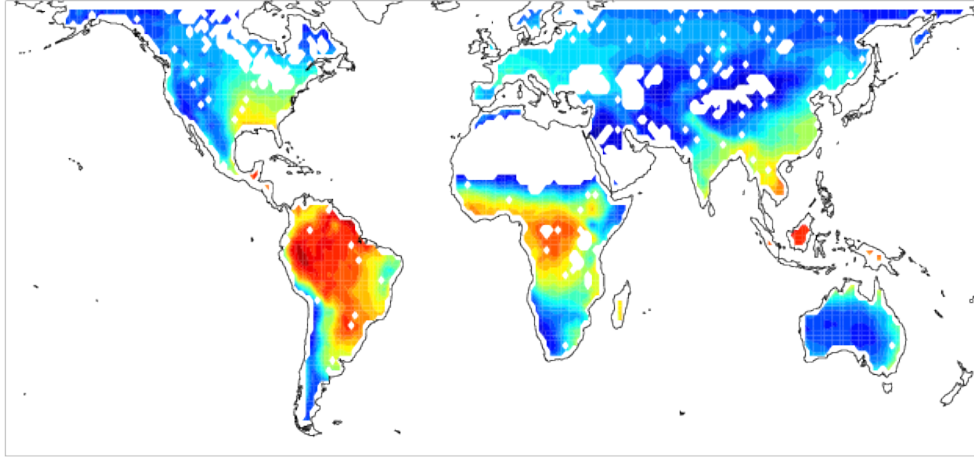
Only common
land pixels
considered.



Median ET 1989-1995

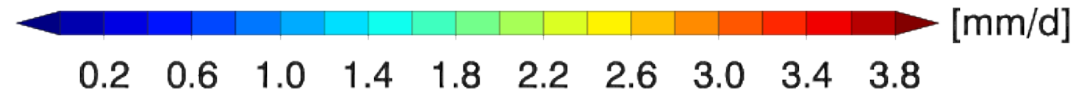
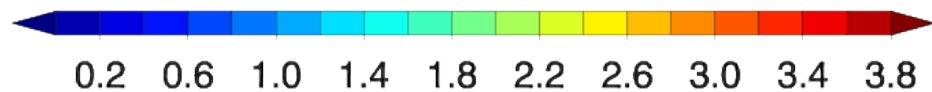
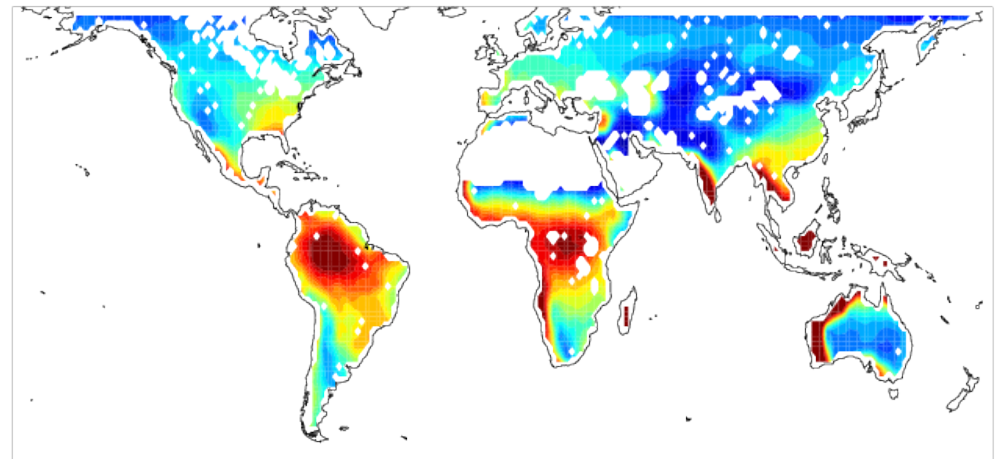
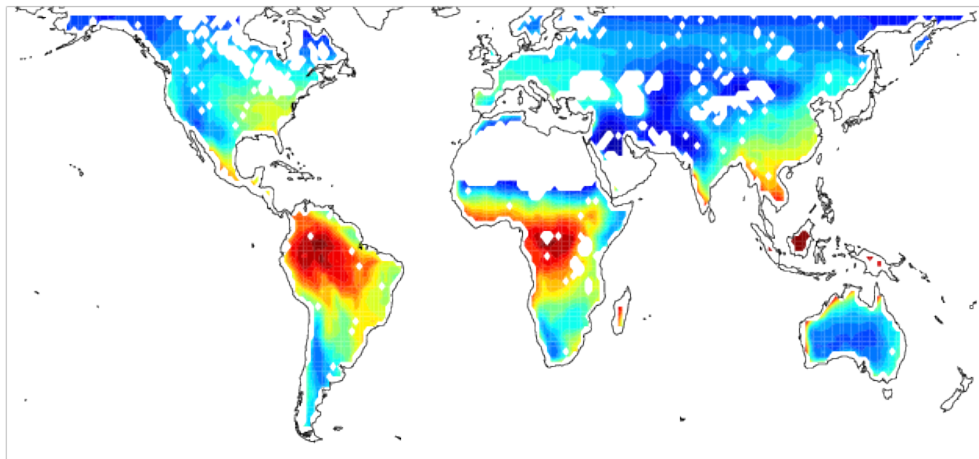
Reference datasets

Reanalyses



IPCC CMIP3

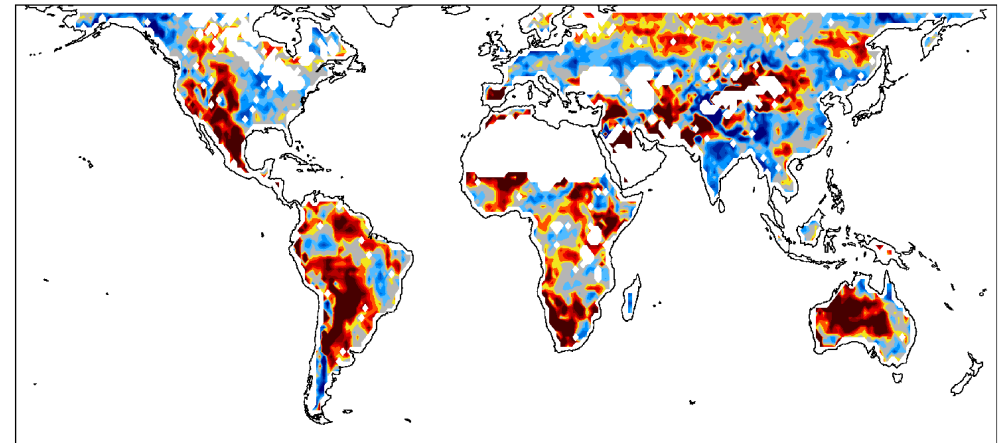
IPCC CMIP5



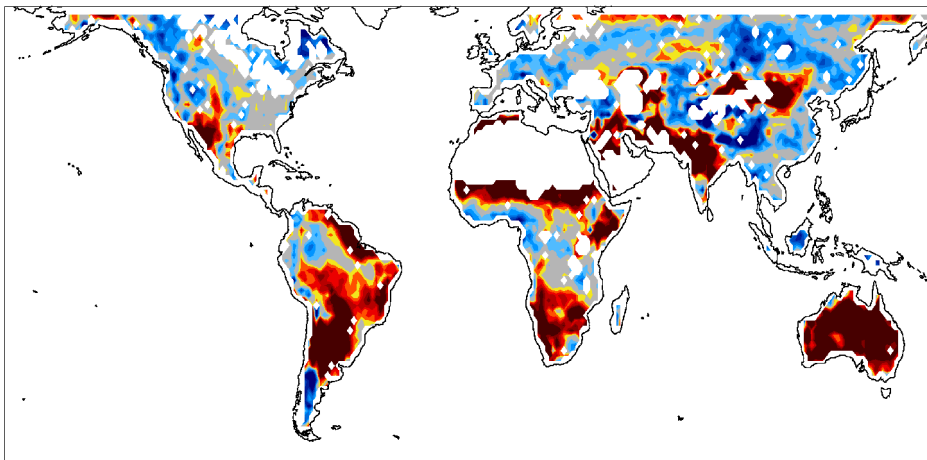
Relative interquartile range of ET

Differences to reference datasets

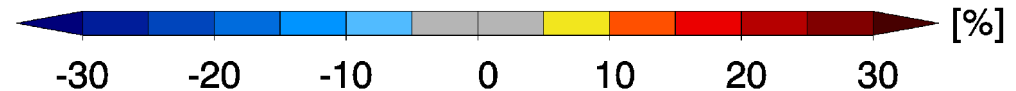
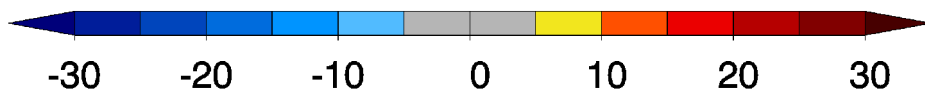
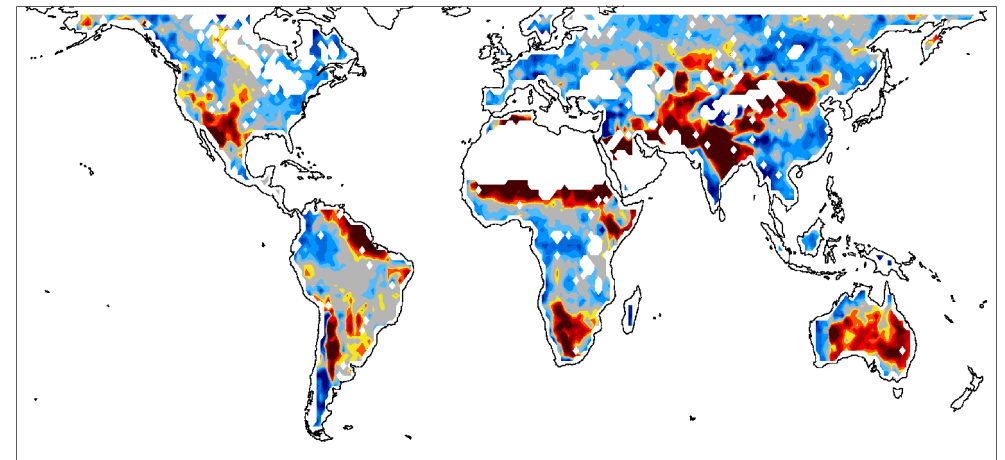
Reanalyses - Reference



IPCC CMIP3 - Reference



IPCC CMIP5 - Reference

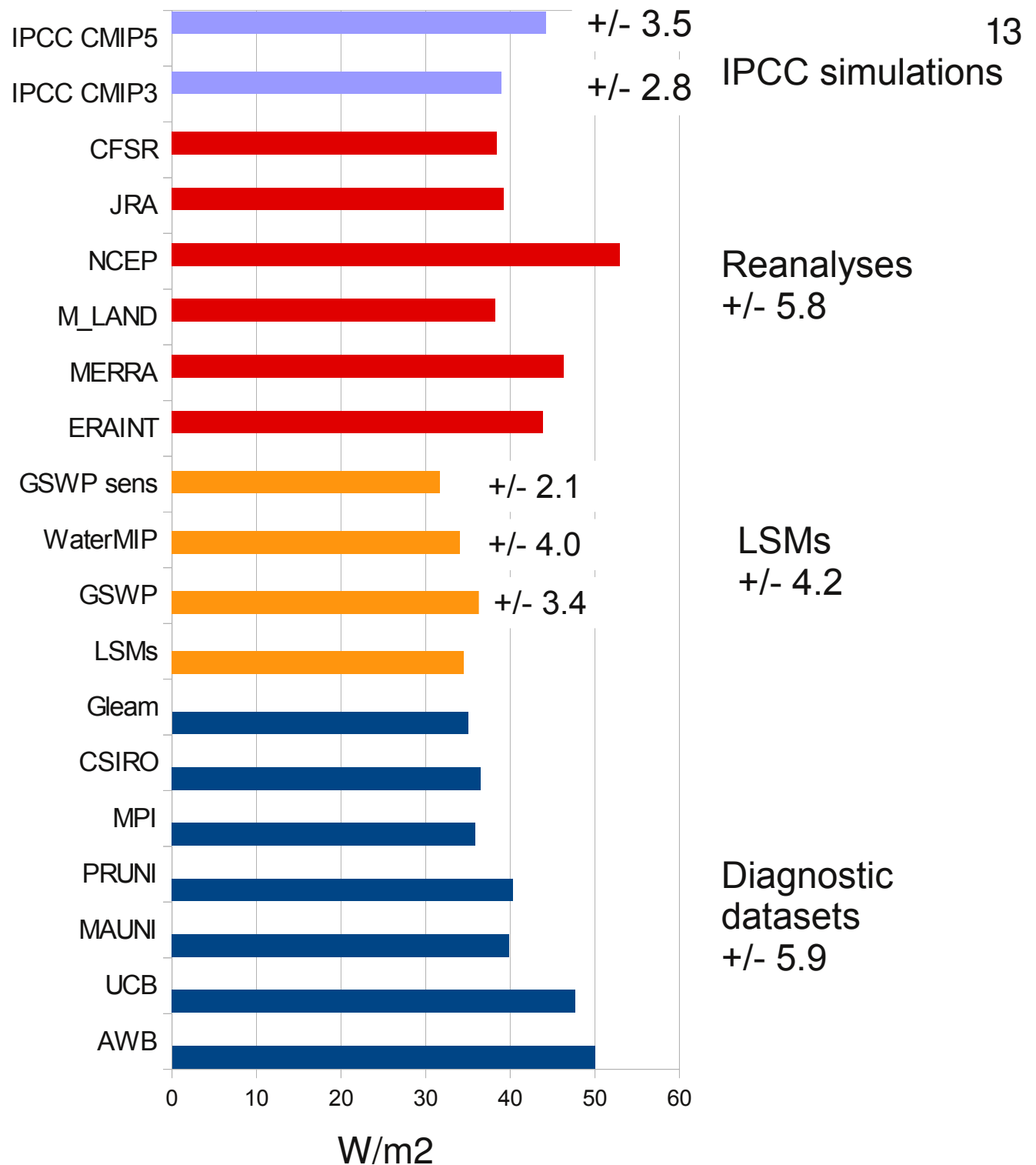


Main findings 1

- Globally, range between reanalyses similar ($\pm 5.8 \text{ W/m}^2$) to diagnostic datasets ($\pm 5.9 \text{ W/m}^2$)
- LSMs and IPCC simulations smaller range
- Arid regions: Reanalyses and IPCC models high range between datasets (within category)

Global land ET means

Only common
land pixels
considered.



③ **GSWP Sensitivity runs**

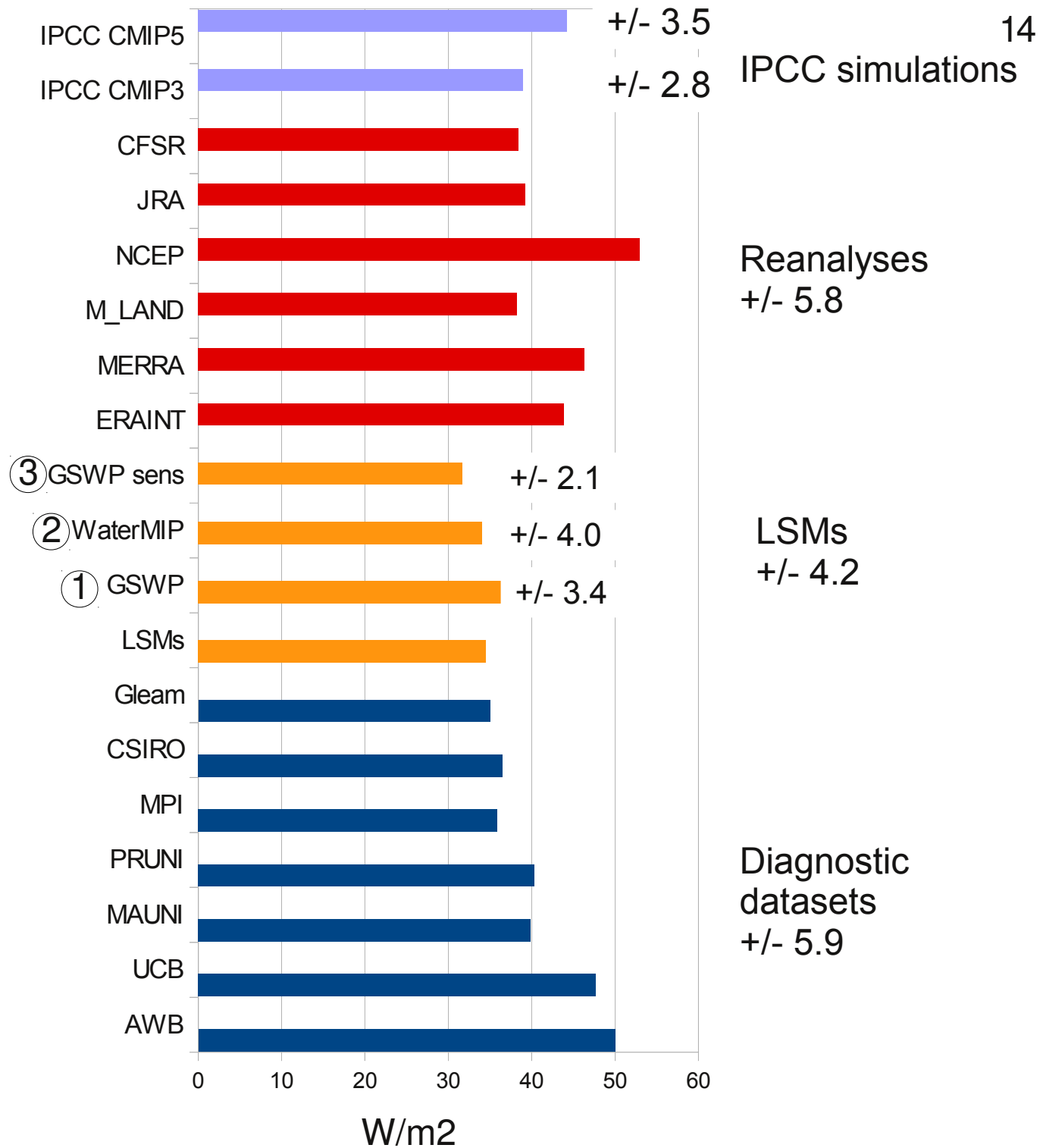
COLA with different precipitation forcings

② **WaterMIP**

LSMs and global hydrological models, same forcing data

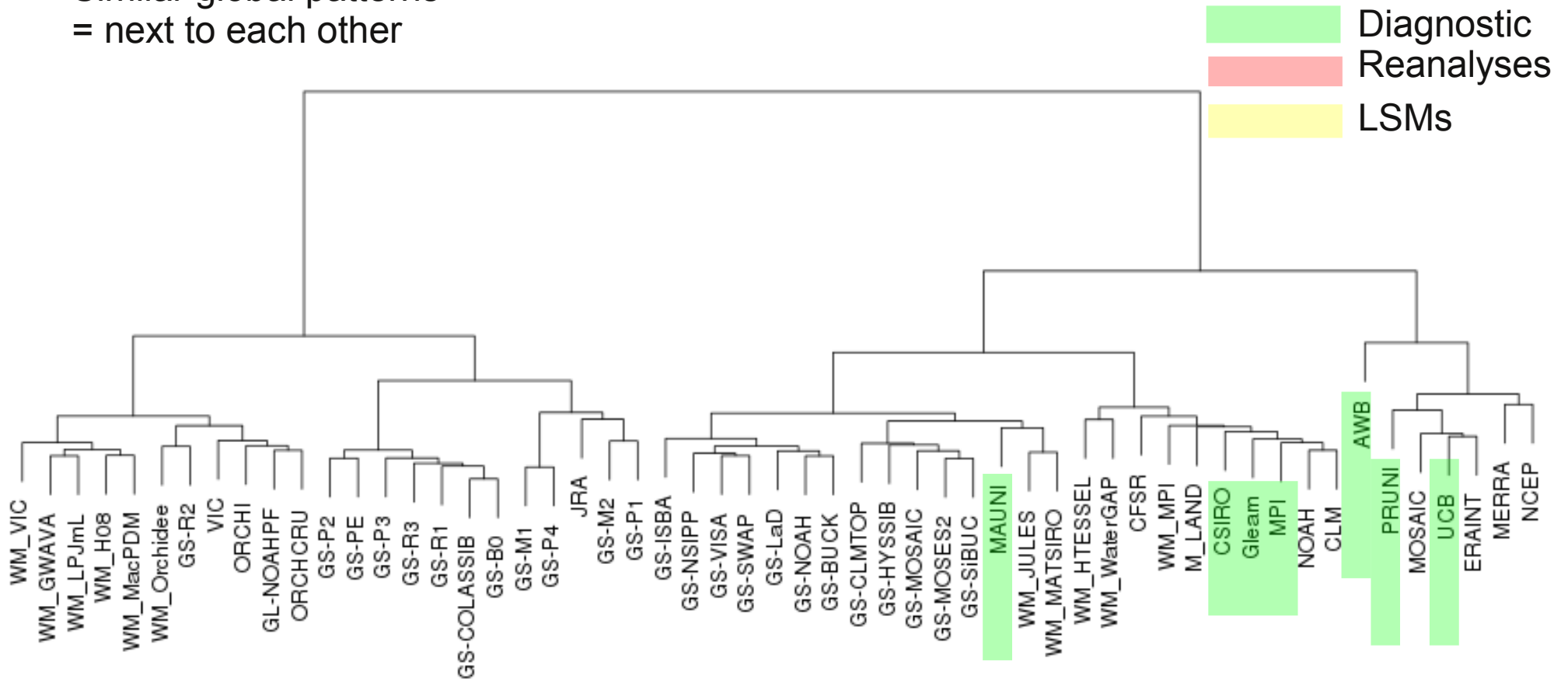
① **GSWP-LSMs**

Several LSMs driven with same forcing data

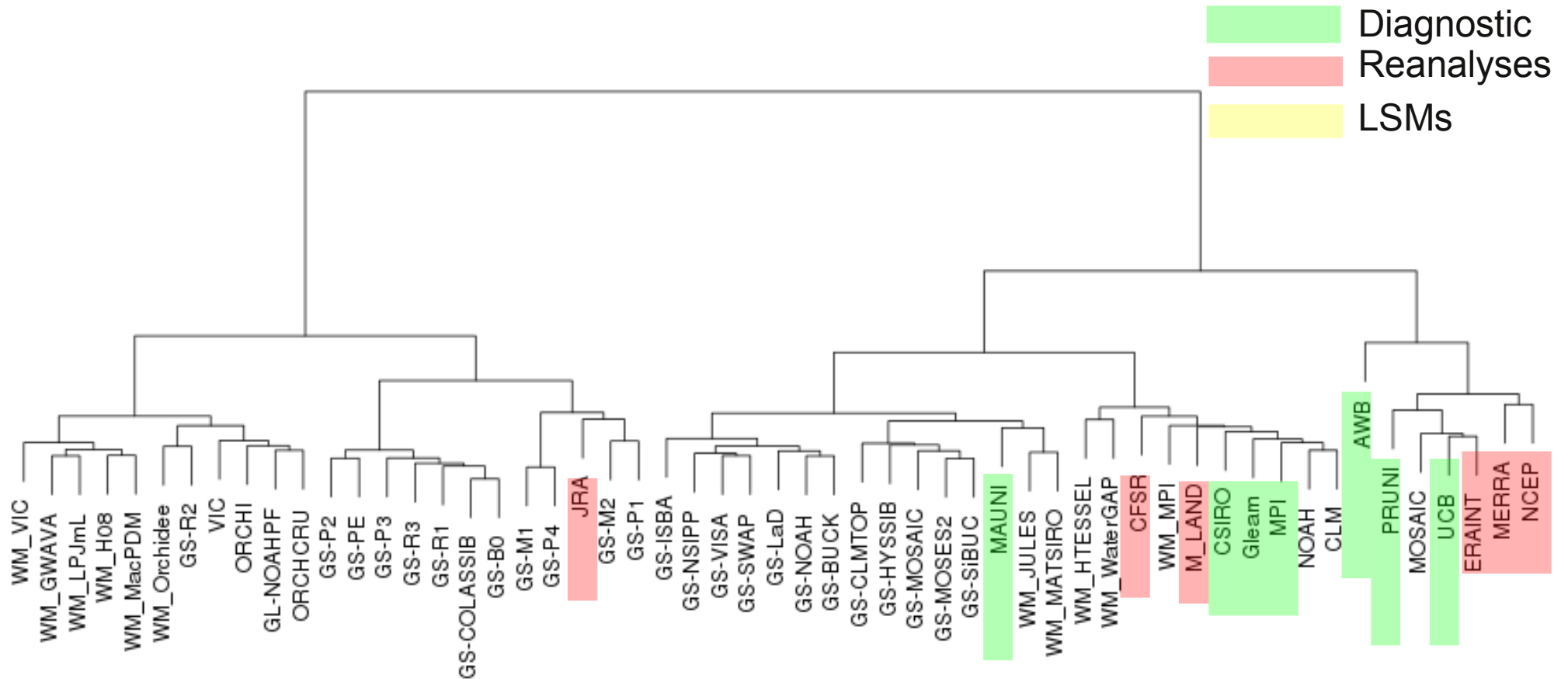


Cluster of multi-year mean ET

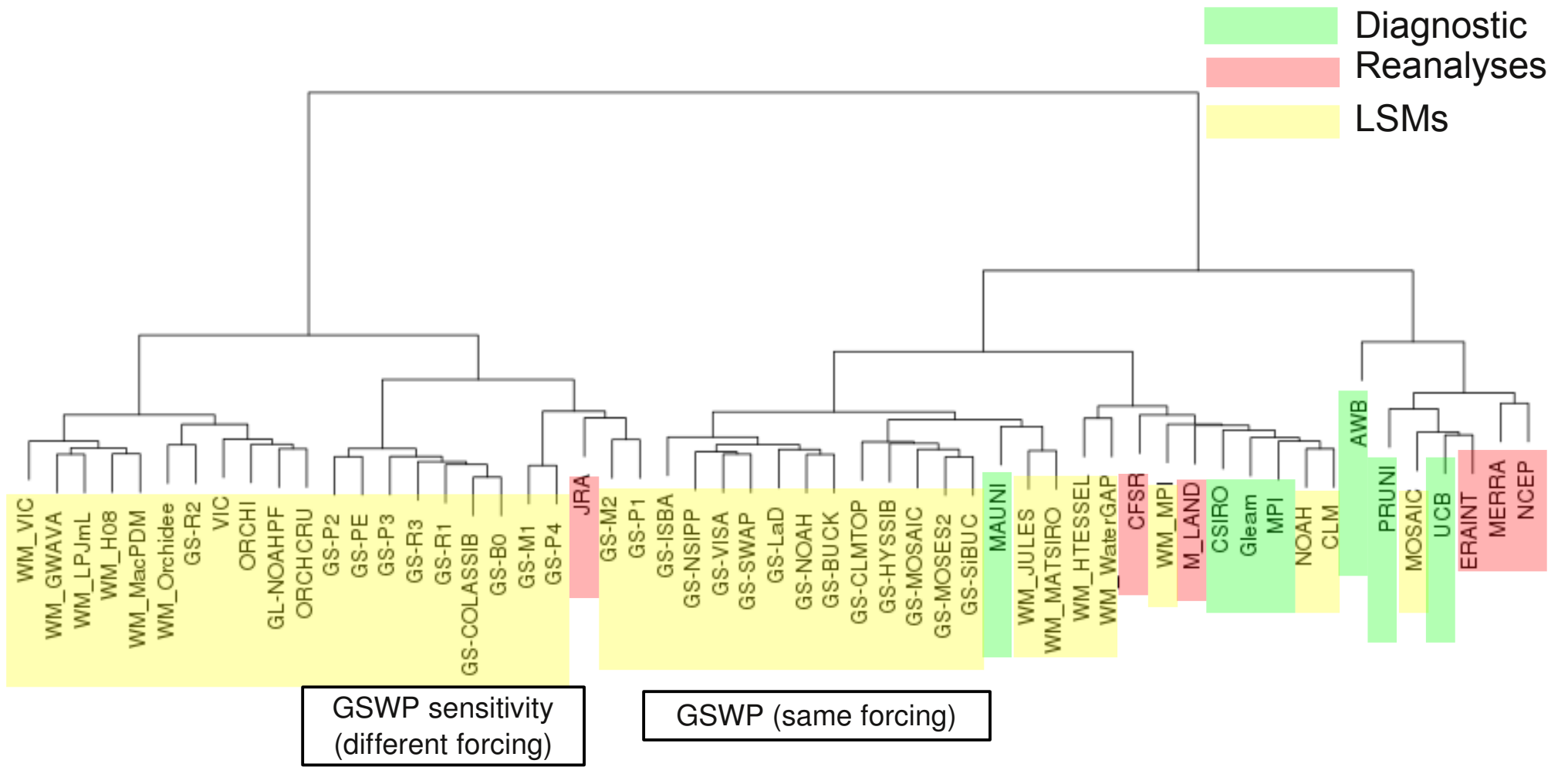
Similar global patterns
= next to each other



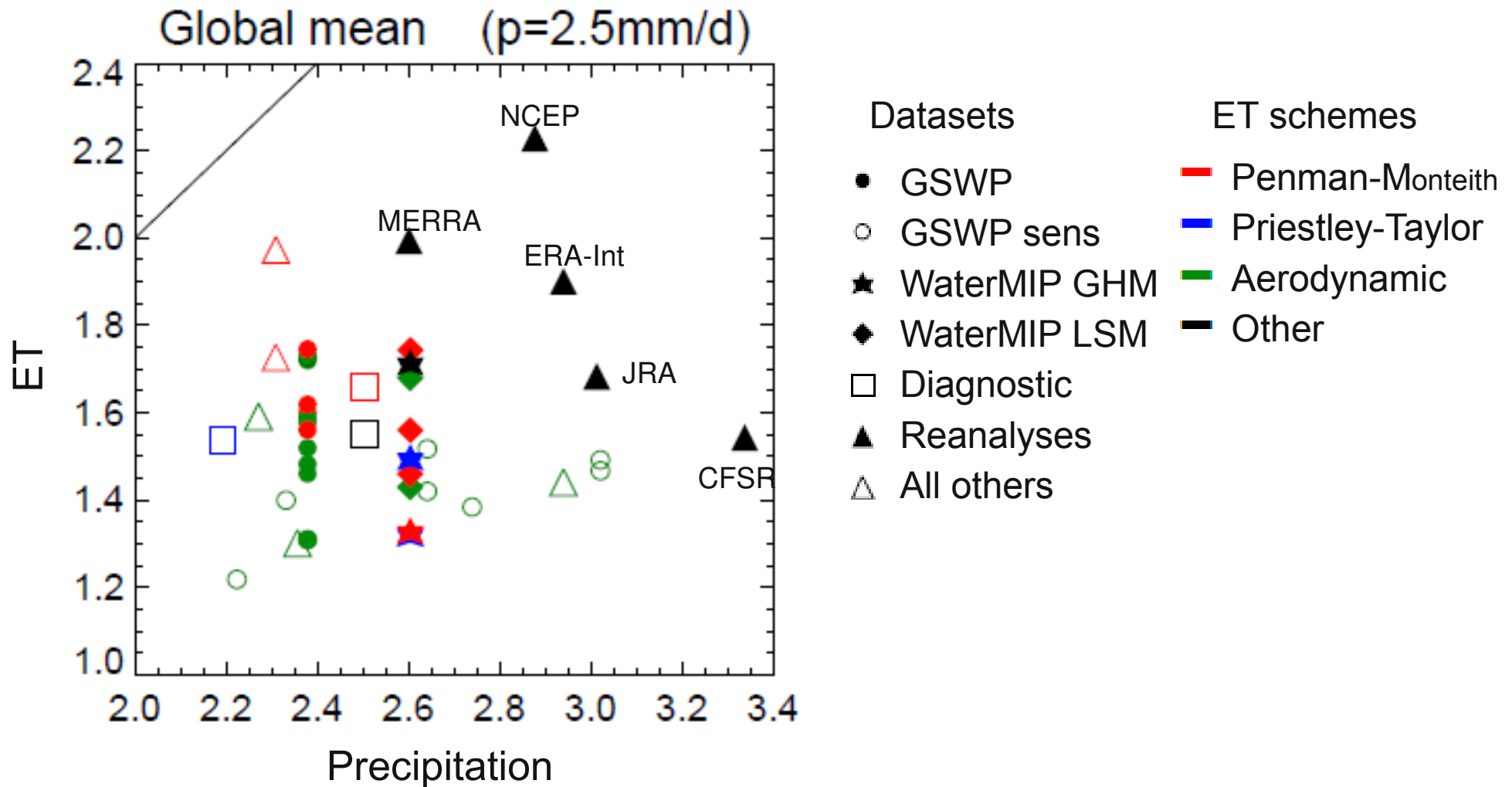
Cluster of multi-year mean ET



Cluster of multi-year mean ET

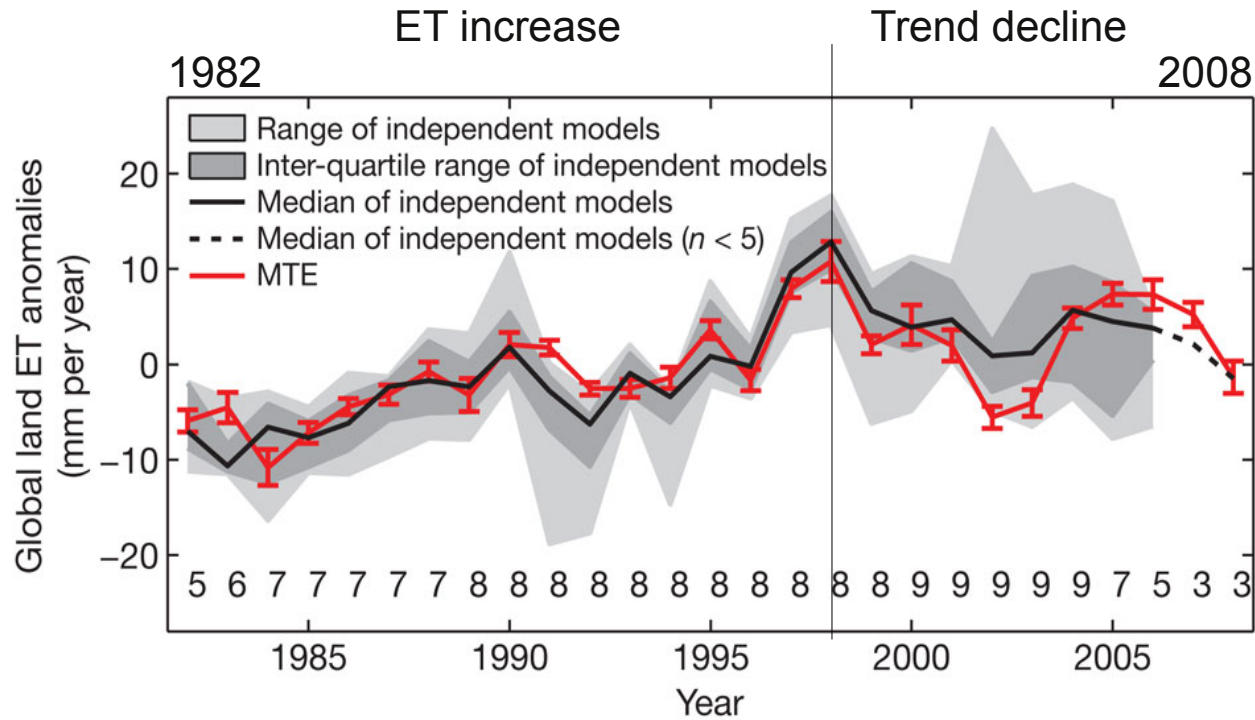


Global mean values – ET vs P



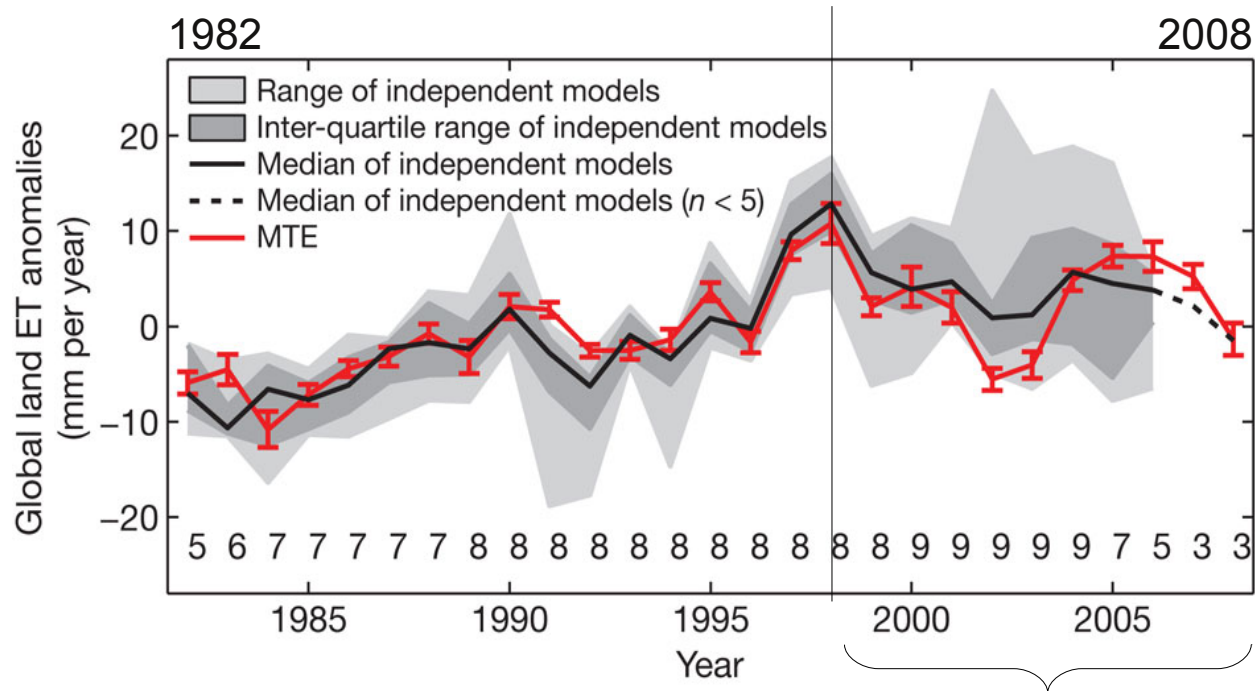
1989-1995 averaged
values in mm/d

Trend change

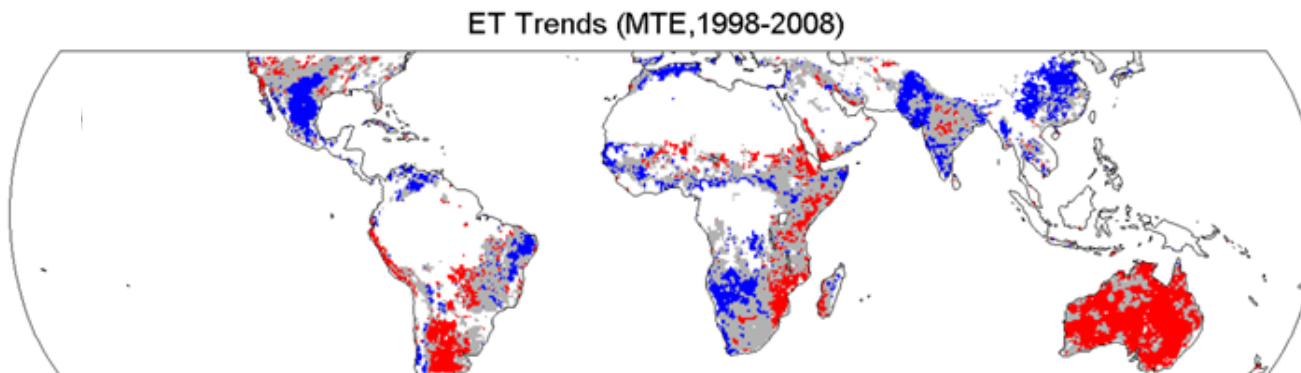


Global land-ET variability according to MTE and independent models.

Trend change



Global land-ET variability according to MTE and independent models.



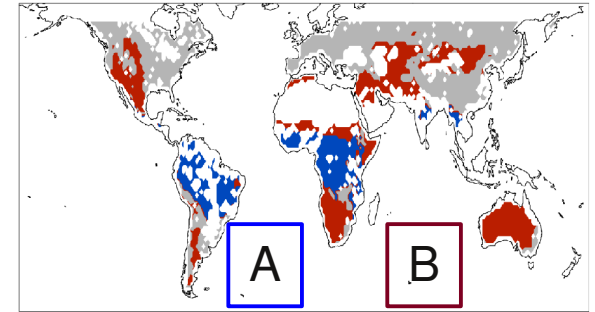
1998-2008

ET decrease
ET increase

Jung *et al.* *Nature*, 2010

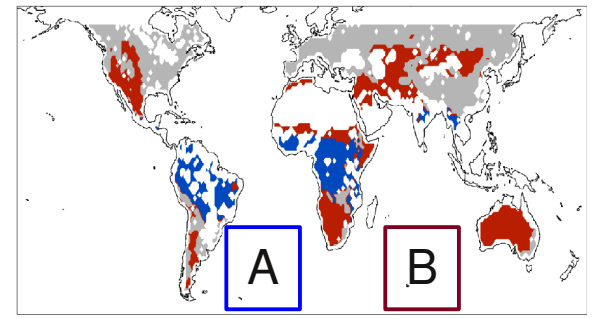
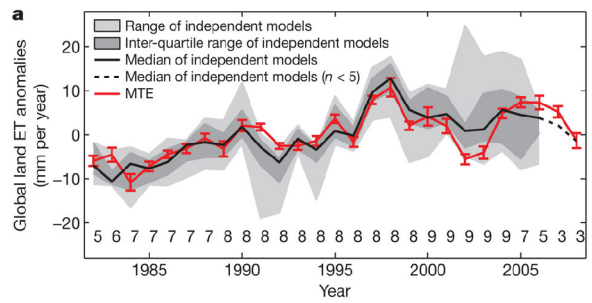
www.iac.ethz.ch/groups/seneviratne

Trend change



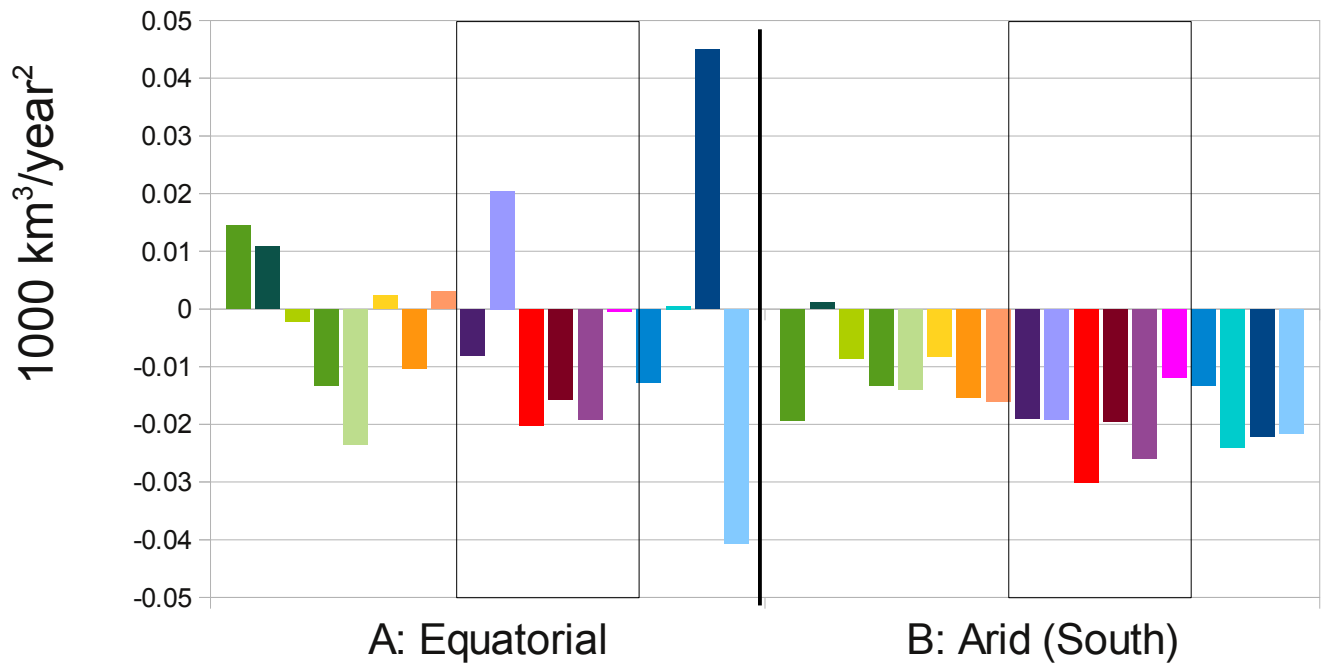
Mean yearly precipitation:
4.6 mm/d 0.9 mm/d

Trend change



Trend change 1998-2005 versus 1989-1997

Evapotransp. Prec



- | | |
|----------|-----------|
| ■ AWB | ■ PRUNI |
| ■ MPI | ■ CSIRO |
| ■ Gleam | ■ VIC |
| ■ ORCHI | ■ ORCHCRU |
| ■ ERAINT | ■ NCEP |
| ■ MERRA | ■ M_LAND |
| ■ JRA | ■ CFSR |
| ■ CRU | ■ GPCC |
| ■ GPCP | ■ CPC |

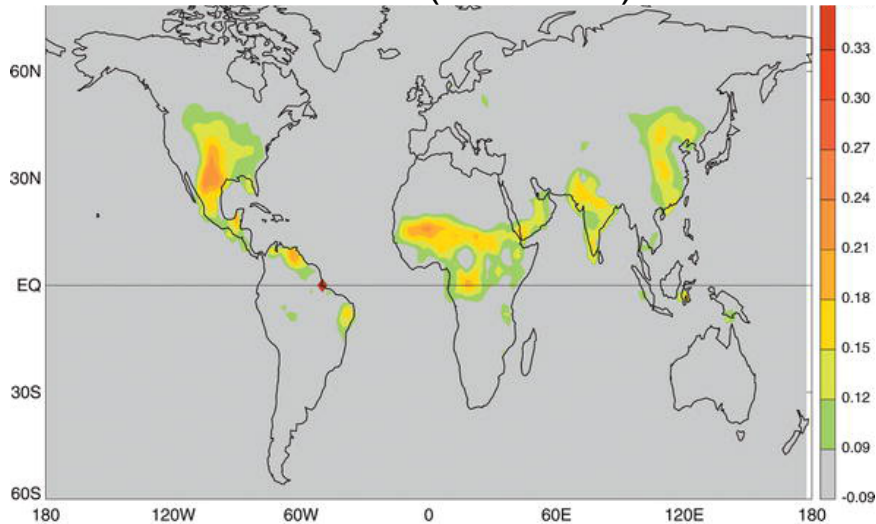
Main findings 2

- Critical role of forcing data – not clear
- Reanalyses relatively high ET and precipitation globally
- Decline of trend in Southern Hemisphere arid regions supported
- Trend change in tropical regions uncertain

Part II: Land-atmosphere coupling

GLACE-I study

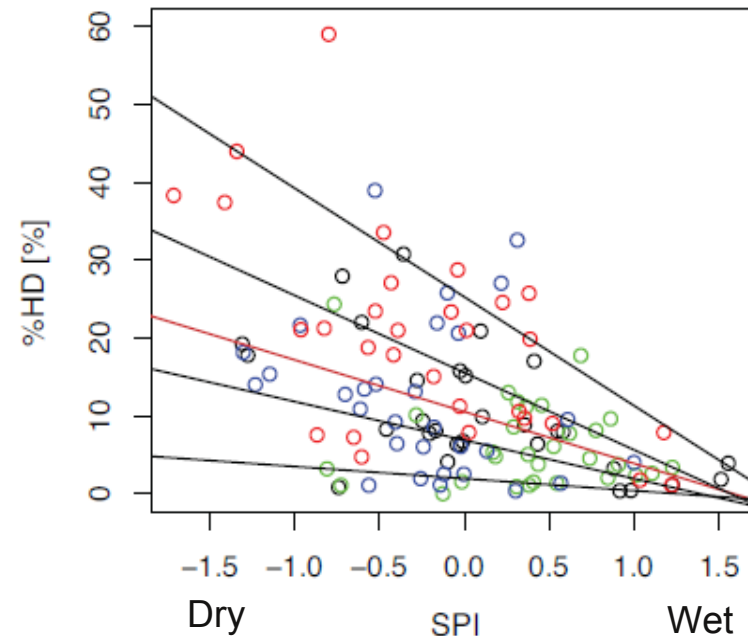
Soil moisture - temperature coupling strength
JJA 1994 (12 GCMs)



Koster et al. *J. Hydromet.*, 2006

SPI – hot day study

a Southeast European domain



Hirschi et al. *Nat. Geosc.*, 2011

Our study:

- Relation of hot temperature extremes and preceding drought conditions
- at the hottest month of each year
- over 1979-2010 period

Hot extremes and drought conditions

Number of Hot Days = NHD

Days with temperature above 90th-percentile of 1979-2010 reference period

Maximum 2-m air temperature from:
ERA-Interim, MERRA, CFSR-NCEP

Standardized precipitation index = SPI

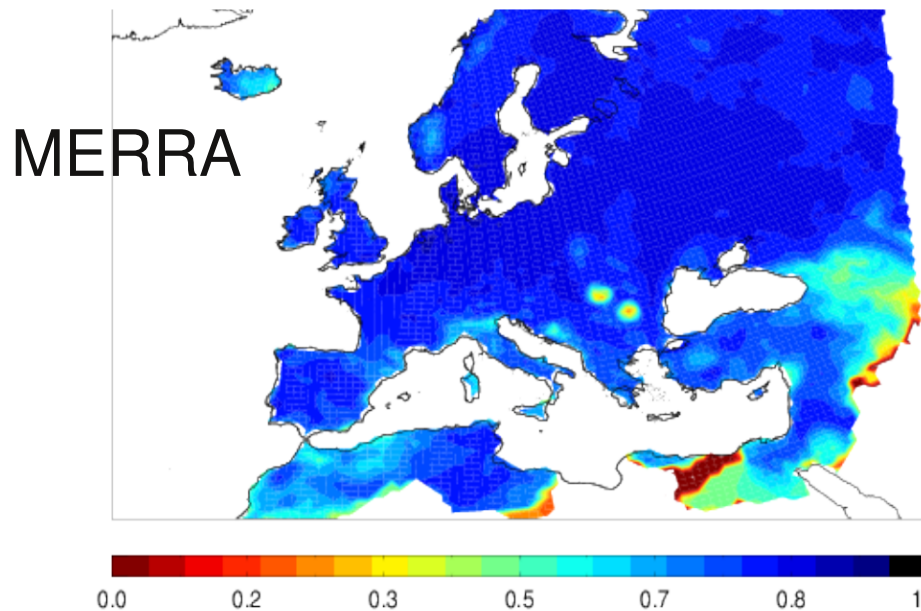
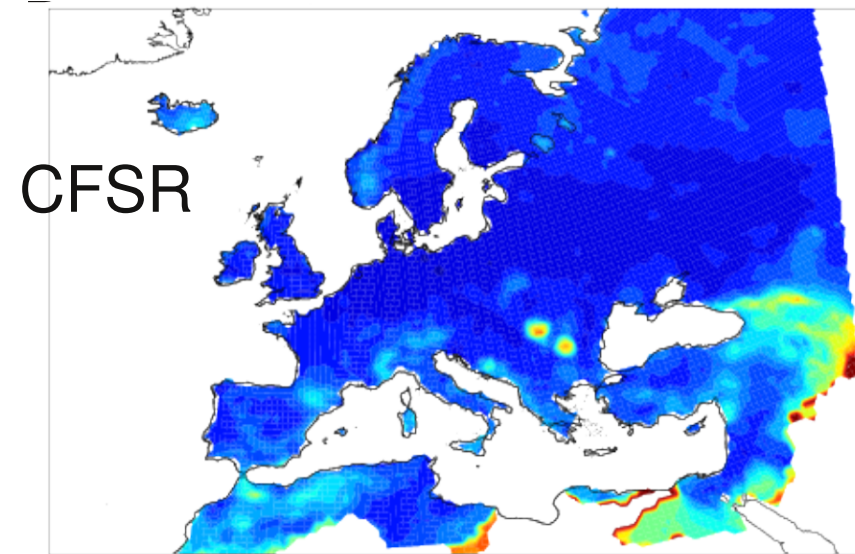
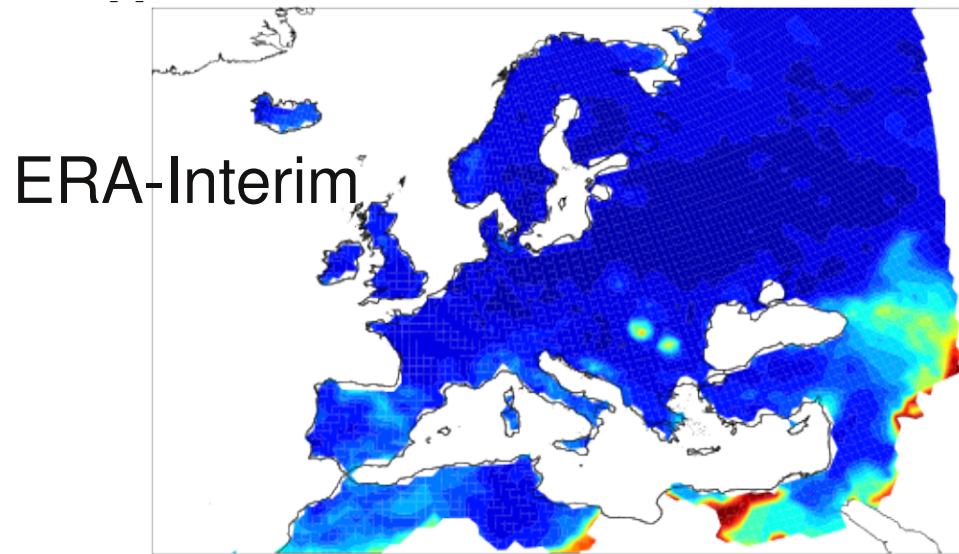
'Observed' precipitation deficits accumulated in previous 3 months from:

CRU, GPCP, CPC

Coupling: Research questions

- How useful is temperature from reanalyses for hot extreme studies?
- In which regions is there a strong relation between hot day occurrence and moisture deficits?

NHD reanalyses versus observations



Correlation of monthly
NHD 1979-2010

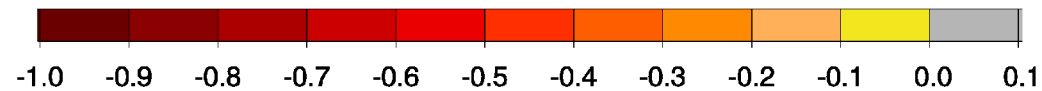
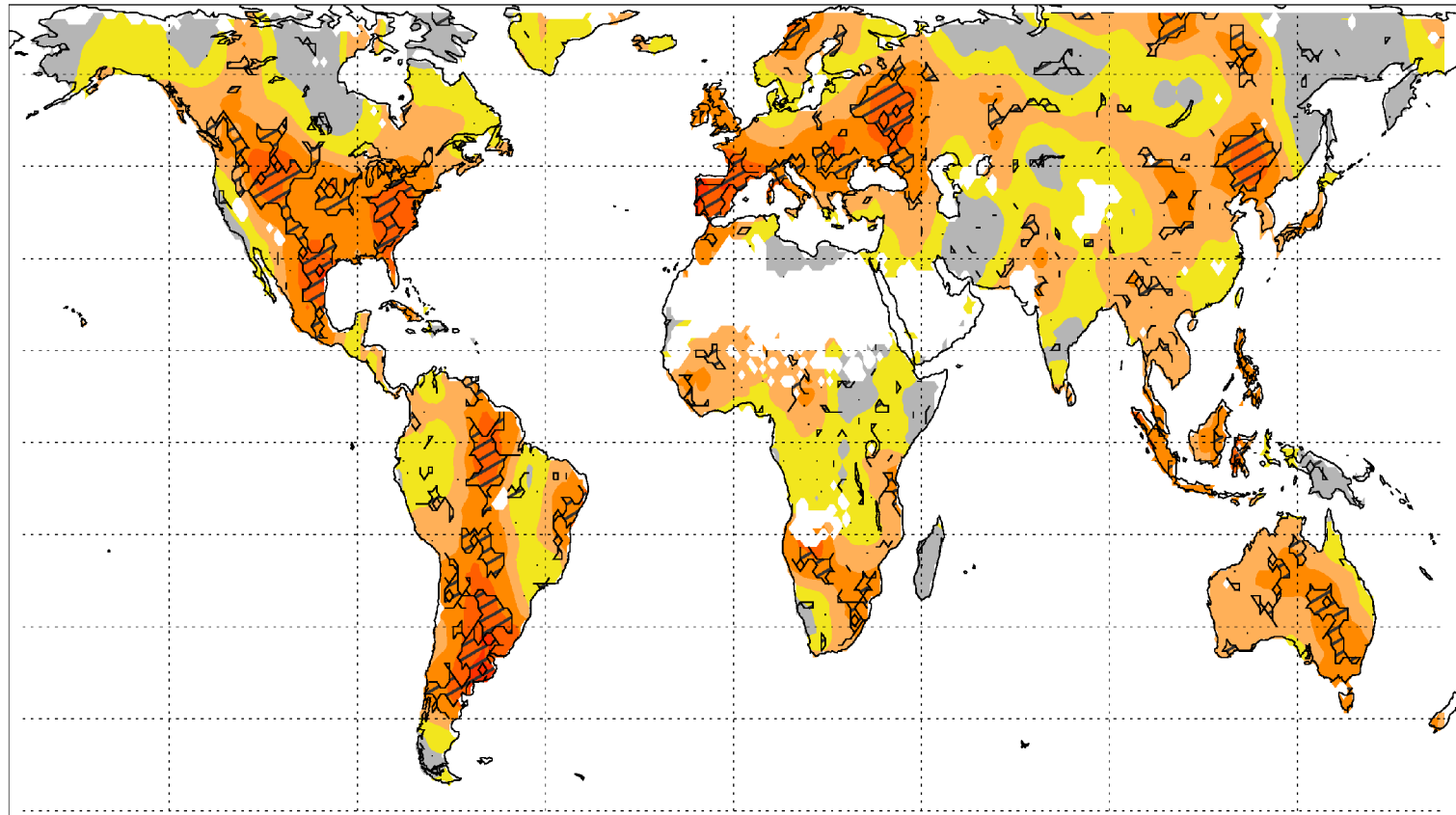
Observations = E-OBS
dataset from the EU-FP6
project ENSEMBLES

Land-atmosphere coupling

Correlation number of hot days and preceding drought index (SPI)

Hot days at
hottest month
of each year
ERA-Interim

Drought index
before that
month
CRU precip

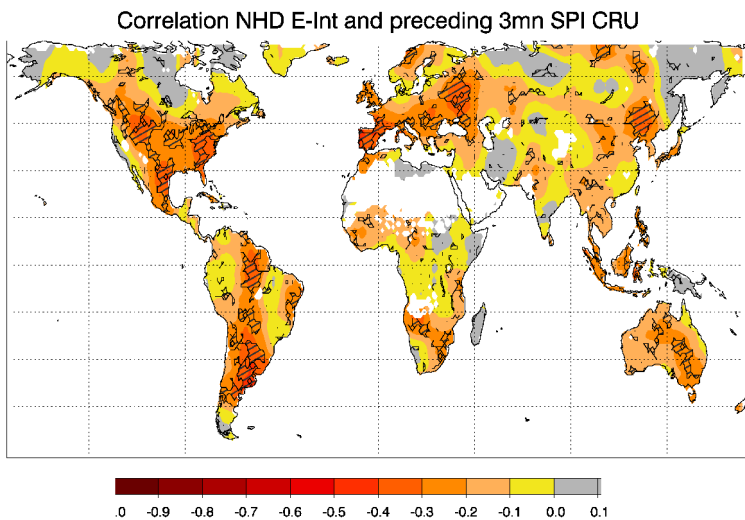


Hatched areas
significant at
90% level

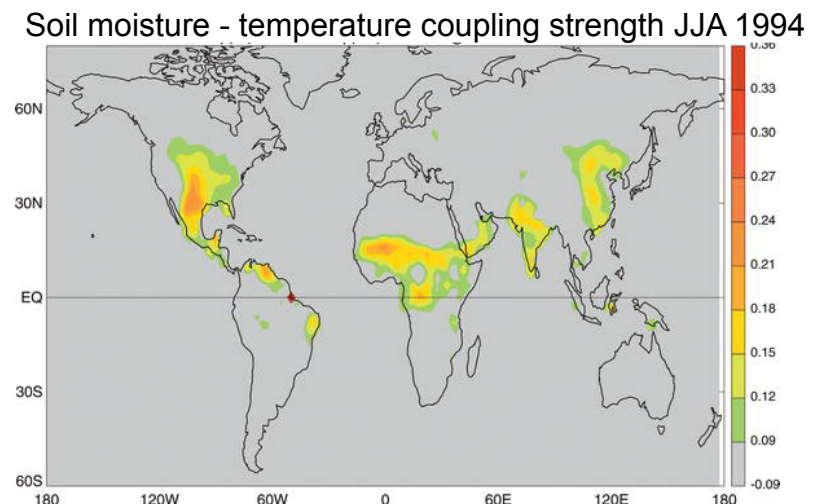
Mueller and Seneviratne (in review)

Difference to GLACE-study

- More hot spots
- Hot spots in Southern hemisphere
- 'Truly global'
- Several years
- Based on observational data



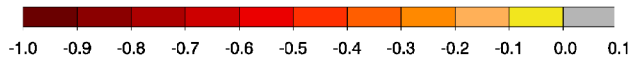
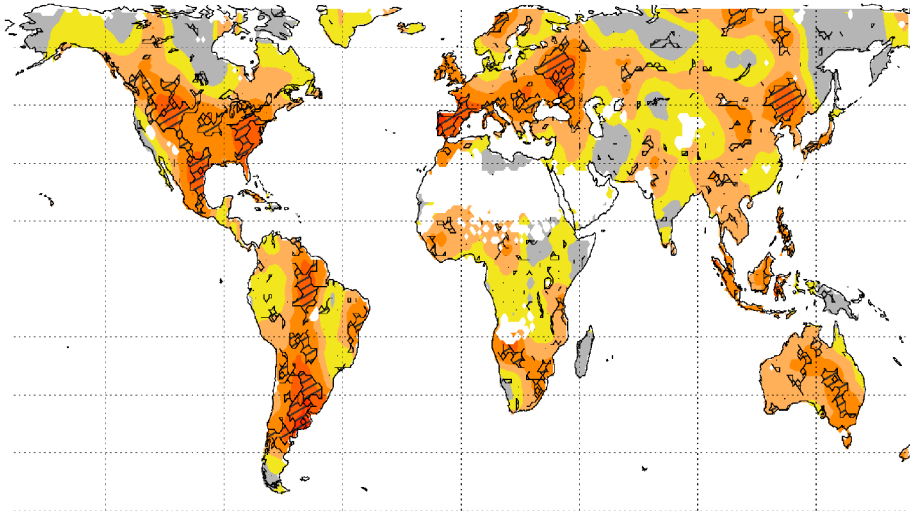
Mueller and Seneviratne (in review)



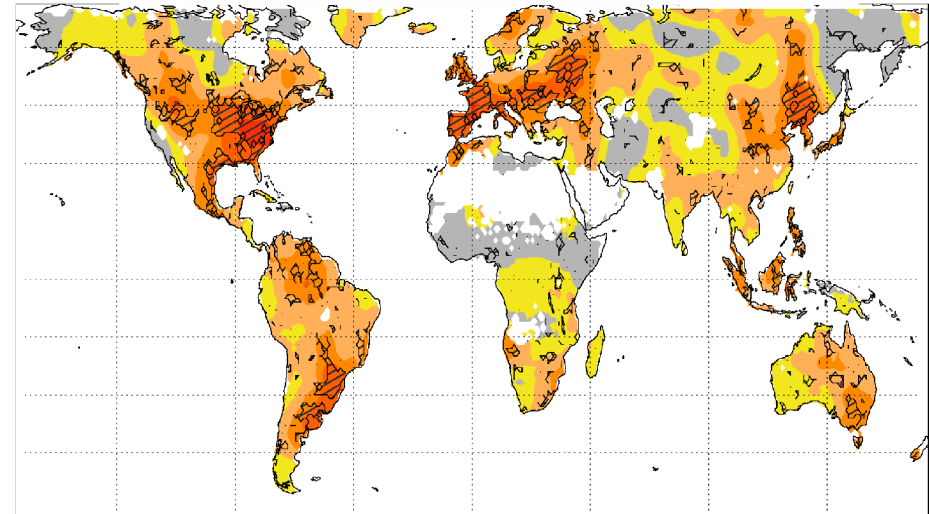
Koster *et al.* *J. Hydromet.*, 2006

ERA-Interim, CFSR and MERRA

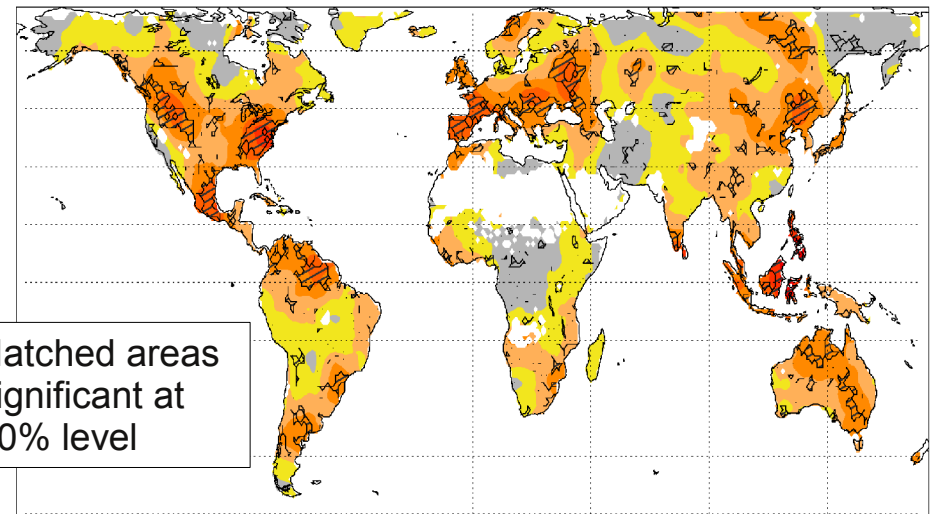
ERA-Interim NHD with CRU SPI



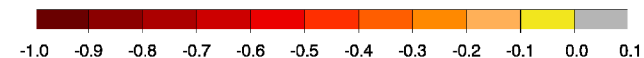
CFSR-NCEP NHD with CRU SPI



MERRA NHD with CRU SPI



Hatched areas
significant at
90% level



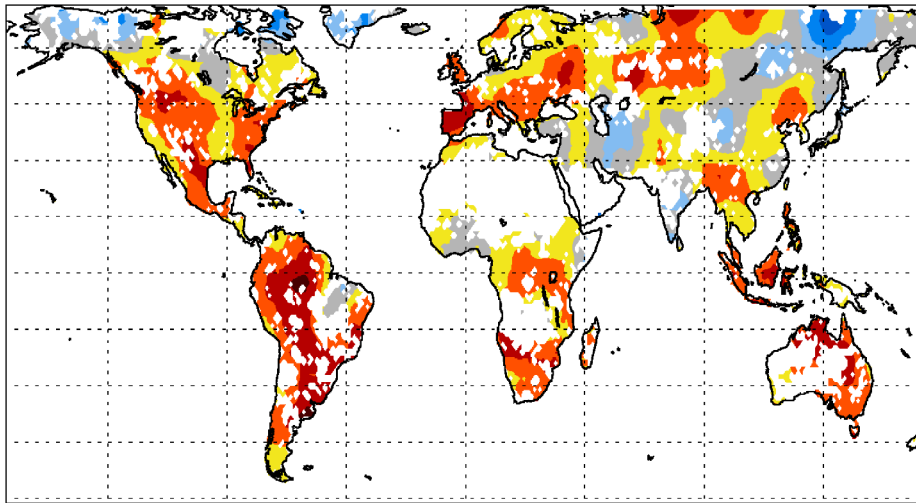
Number of hot days correlated to
drought index SPI

Mueller and Seneviratne (in review)

Hot day occurrence probability

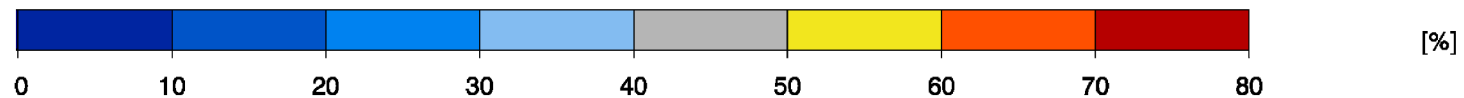
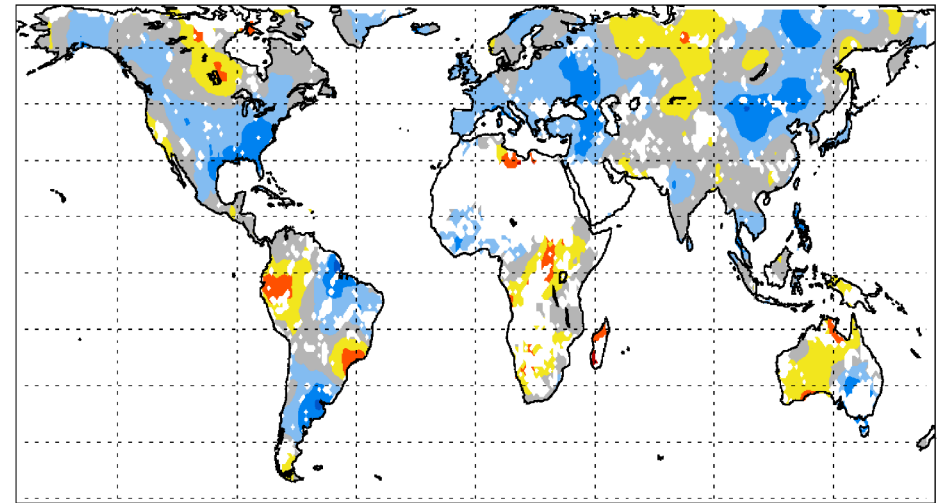
After dry conditions

Above avg. NHD after SPI < -0.8



After wet conditions

Above avg. NHD after SPI > 0.8



Occurrence probability in % of years for
above-average hot day numbers

Datasets:

Number of hot days: ERA-Interim

3-month SPI: CRU

Mueller and Seneviratne (in review)

Summary

- 2
 - Reanalyses useful for **land-atmosphere interaction** studies
 - Only small differences between reanalyses in 2m-air temperature (for such studies)
 - Land-surface - atmosphere **coupling** important in wide areas of the globe

- 1
 - **Uncertainties in ET** in all analyzed datasets comparable
 - Large ET uncertainties in **tropical** regions (changes in hydrological cycle unknown)
 - **ET trend** decreased after 1998 in arid Southern Hemispheric regions

Thanks to the WCRP for the travel support

and the LandFlux-EVAL team

S.I. Seneviratne, C. Jimenez, T. Corti, M. Hirschi, G. Balsamo, P. Ciais, P. Dirmeyer, J. Fisher, F. Ludwig, Z. Guo, M. Jung, F. Maignan, M. McCabe, R. Reichle, M. Reichstein, M. Rodell, J. Sheffield, A. Teuling, K. Wang, E. Wood, Y. Zhang for their contribution.

IPCC CMIP5 data were provided by Jan Sedlacek (IAC ETH)

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Supplementary material

	NCEP	ECMWF	NASA	NASA
	CFSR	ERA-Interim	MERRA	MERRA-LAND
	Coupled Forecast System Reanalysis	ECMWF Reanalysis	Modern Era Retrospective-analysis for Research and Applications	see MERRA
Time covered	1979/1948 - present	1979-present (soon)	1979-present	see MERRA
Forecast	9h / ocean-coupled 30min, land analysis 24h	12h	6h	see MERRA
Resolution	T382 (38km)	T255 (79 km)	30 km	see MERRA
ET param	Penman-Monteith	similar to Penman-Monteith, feedback of skin temp on R, G	Penman-Monteith	see MERRA
LSM	NOAH	TESSEL	Catchment LSM	see MERRA
Advantage	Fully coupled, GFS as background assimilation model, and recently av. Observations	Good precip, observ. of temp and humidity	LSM: Topographic statistics, dynamical update of 3 SM-regimes in each land tile and fluxes computed separately for the 3 regimes	Precip consistent with GPCP, Catchment model parameters improved
Problems		Snow analysis, SM optimised for atmospheric fluxes rather than accuracy	No assimilation of land surface obs., precip errors as for other reanalyses (regional biases, intensity, diurnal cyc)	less precipitation errors than MERRA
Radiation	satellite, GSI	None	Excessive ET caused by overest. surf. Radiation under cloudy conditions	Revised Cathment model parameters ameliorate excessive canopy ET
Surface Temp	different, including other reanalyses	T2m, rh2m for soil moisture state		
Precip	Not assimilated, but SM/snow from GLDAS driven with observed precip	None	None	Precip corrected to match GPCP
Development plans	LSM: Co2-based canopy conductance, multi-layer snowpack, ground water, river-routing scheme	Use of land-surface photosynth. based ET and natural carbon dioxide schemes	Improved and dynamic vegetation model component, Land data assimilation included in next rean.	

Category	Subgroup	Name	Reference	Information	Avail. yrs	Grid/Resolution
Diagnostic datasets		UCB	Fisher et al. (2008)	Priestley-Taylor, ISLSCP-II (SRB, CRU, AVHRR)	1986-1995	0.5°
		MAUNI	Wang and Liang (2008)	Empirical, calibrated with Ameriflux, ISLSCP-II (SRB, CRU, AVHRR)	1986-1995	1°
		PRUNI	Sheffield et al. (2010)	Penman-Monteith ET, ISCCP, AVHRR	1984-2006	0.25°
		MPI	Jung et al. (2009)	Empirical, global upscaling of FLUXNET data, CRU etc.	1982-2008	0.5°
		GLEAM	Miralles et al.			
		CSIRO AWB	Zhang et al. (2010) Mueller et al. (2010)	Penman-Monteith-Leuning ET Atmospheric water balance (GPCP, ERA-Interim)	1984-2009 1989-2008	2.5°
LSMs	GSWP	GS-COLA, GS-NOAH, GS-NSIPP, GS-VISA, GS-ISBA, GS-BUCK, GS-CLM TOP, GS-HYSSIB, GS-LAD, GS-MOSAIC, GS-MOSES2, GS-SIBUC, GS-SWAP	Dirmeyer et al. (2006)	13 GSWP LSM simulations, forced with ISLSCP-II and/or reanalysis data:	1986-1995	1°
	GSWP	Sensitivity runs from COLA model			1986-1995	
	GLDAS	GL-NOAH, GL-CLM, GL-MOSAIC	Rodell et al. (2004)	GLDAS LSM simulations	1979-2009	1°
	ORCH	EI-ORCH	Krinner et al. (2005)	ORCHIDEE LSM with ERA-Interim forcing	1989-2008	0.7°
		CRU-ORCH		ORCHIDEE LSM with CRU-NCEP forcing	1989-2008	0.7°
	WaterMIP	WM-GWAVA, WM-H08, WM-HTESSEL, WM-JULES, WM-LPJmL, WM-MacPDM, WM-MATSIR, WM-MPI, WM-VIC, WM-WaterG, WM-ORCHI				
	VIC	VIC	Sheffield and Wood (2008)	2CLSM with combined model/observation dataset of meteorological forcing	1948-2008	
Reanalyses		ERA-INT	Dee and Uppala (2008)	ERA-Interim Reanalysis	1989-2008	0.5°
		MERRA	Bosilovich (2008)	Reanalysis	1979-2009	0.5°x0.6°
		M-LAND		MERRA-Land Reanalysis	1979-2007	0.5°x0.6°
		NCEP CFSR	Kalnay et al. (1996)	Reanalysis	1948-2010	0.5°x0.6°
		JRA-25	Onogi et al. (2007)	Reanalysis	1979-2007	2.5°

CMIP3 and CMIP5 models considered

CMIP3:

ECHAM5
 INMSM
 IPSL
 HadGEM
 NCAR
 HacCM
 MRI
 GISS
 Miroc-med
 CCCMA
 GFDL

CMIP5:

BCC_CSM	MIROC_ESM
CanESM2	MPI_ESM_LR
CNRM_CM5	MRI_CGCM3
CSIRO_Mk3	NorESM1
GFDL_CM3	
GISS_E2H	
HadCM3	
HadGEM2	
Inmcm4	
IPSL_CM5A_LR	

All simulations:
20 century (historical)

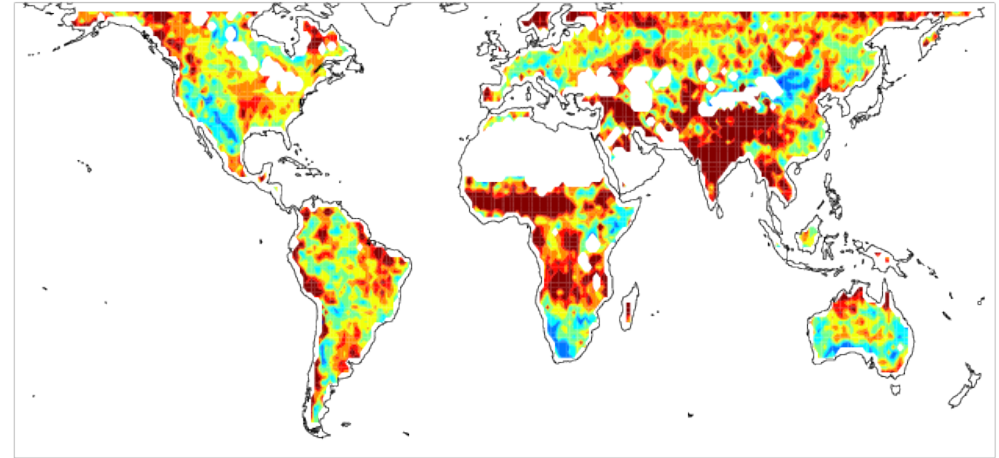
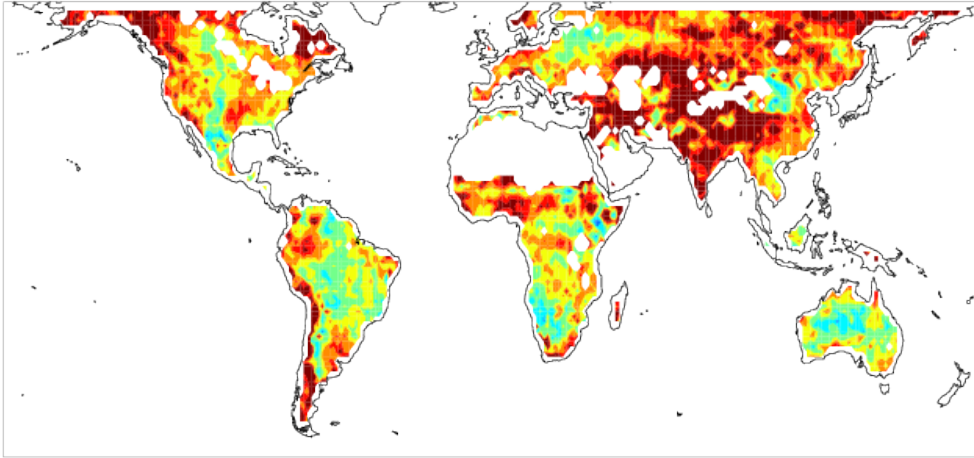
Sensitivity experiments GSWP

All variables	B0	Standard forcing data: NCEP Precipitation hybrid. with GPCP, corrected for gauge undercatch & blended with GPCC Radiation from SRB
	M1	All original NCEP meteorological data (no hybridization with observational data)
	M2	All original ERA-40 meteorological data (no hybridization with observational data)
Precipitation	P1	ERA-40 precipitation (no hybridization with observational data)
	P2	NCEP-DOE hybrid. with GPCC corrected for gauge undercatch
	P3	NCEP-DOE hybrid. with GPCC (no undercatch correction)
	P4	NCEP-DOE precipitation (no hybrid. with observational data)
	PE	ERA-40 precipitation hybrid. with GPCC, and blended with GPCP where gauge density is low
Radiation	R1	NCEP-DOE radiation
	R2	ERA-40 radiation
	R3	ISCCP radiation

Uncertainty - relative IQR of ET

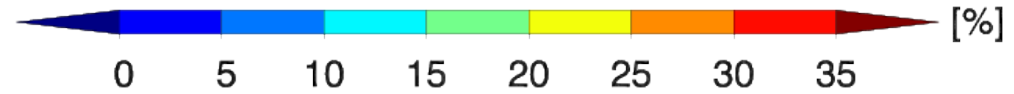
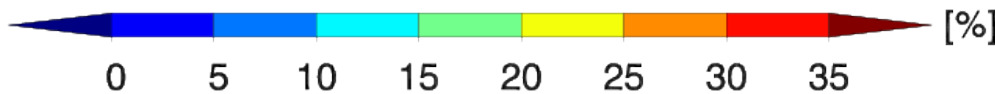
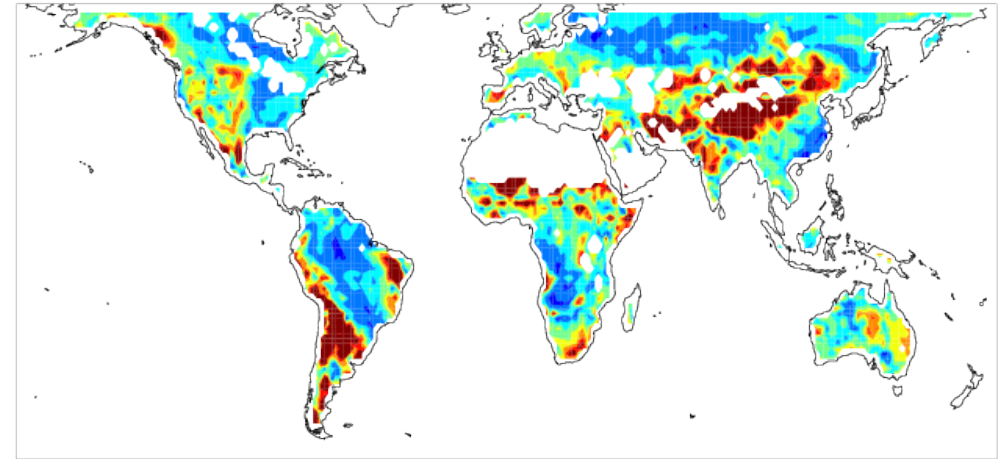
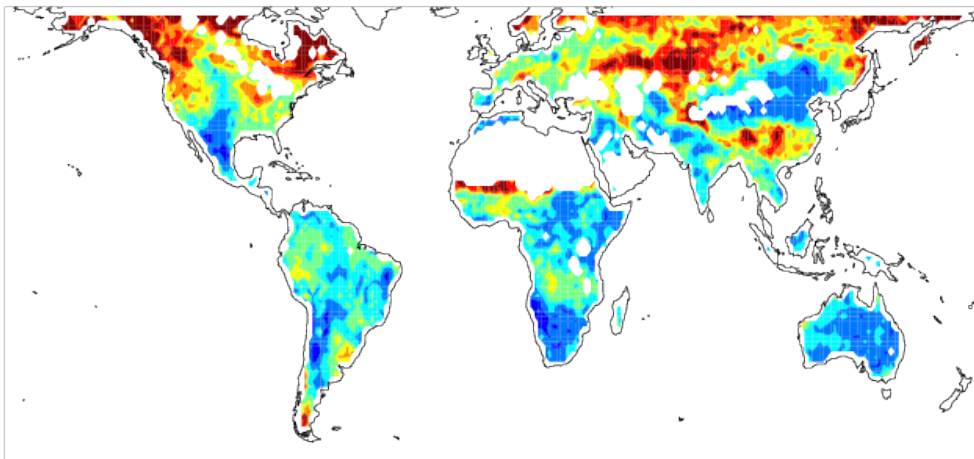
All LSMs

WaterMIP



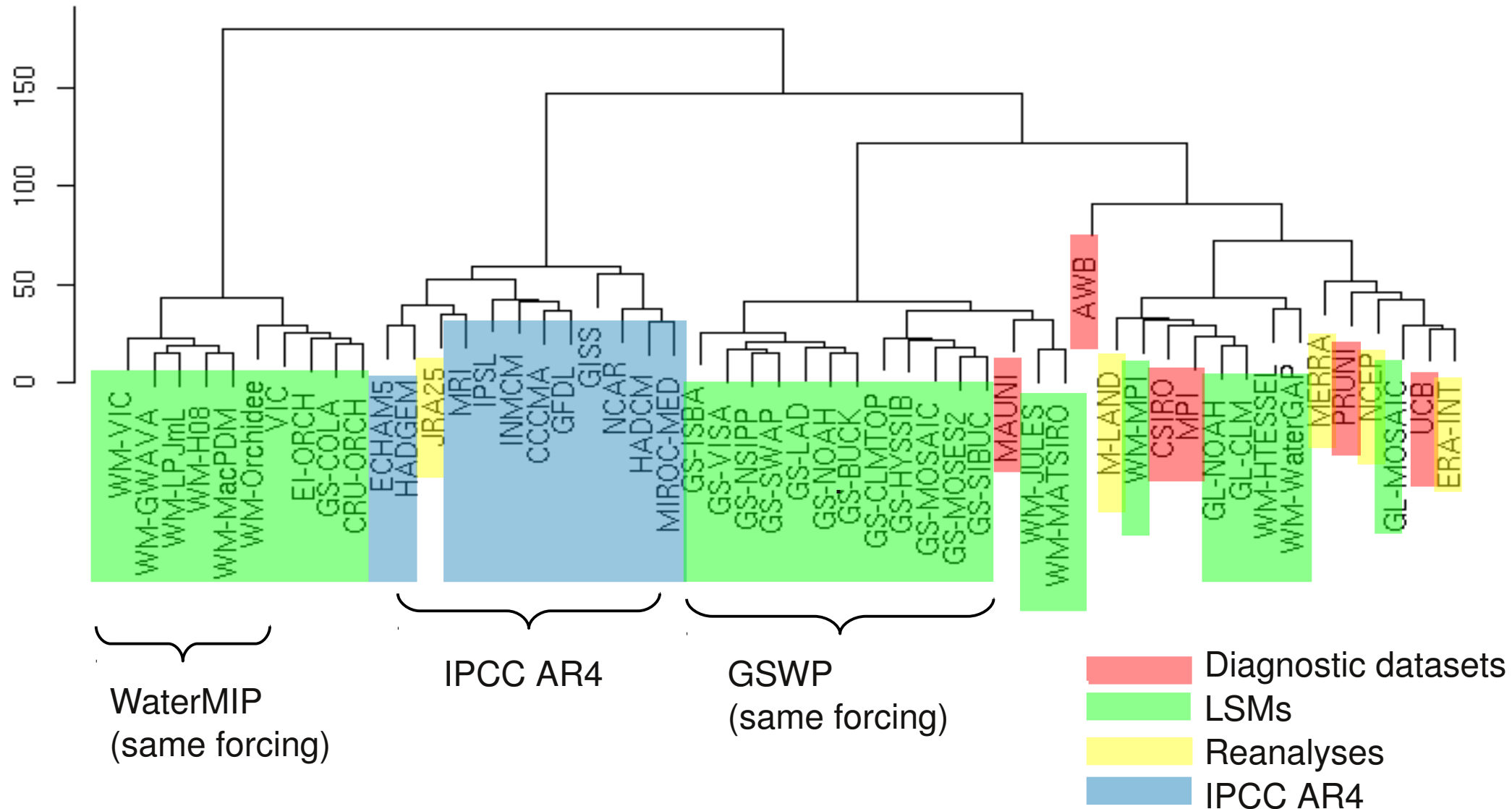
GSWP

COLA sensitivity runs (GSWP)



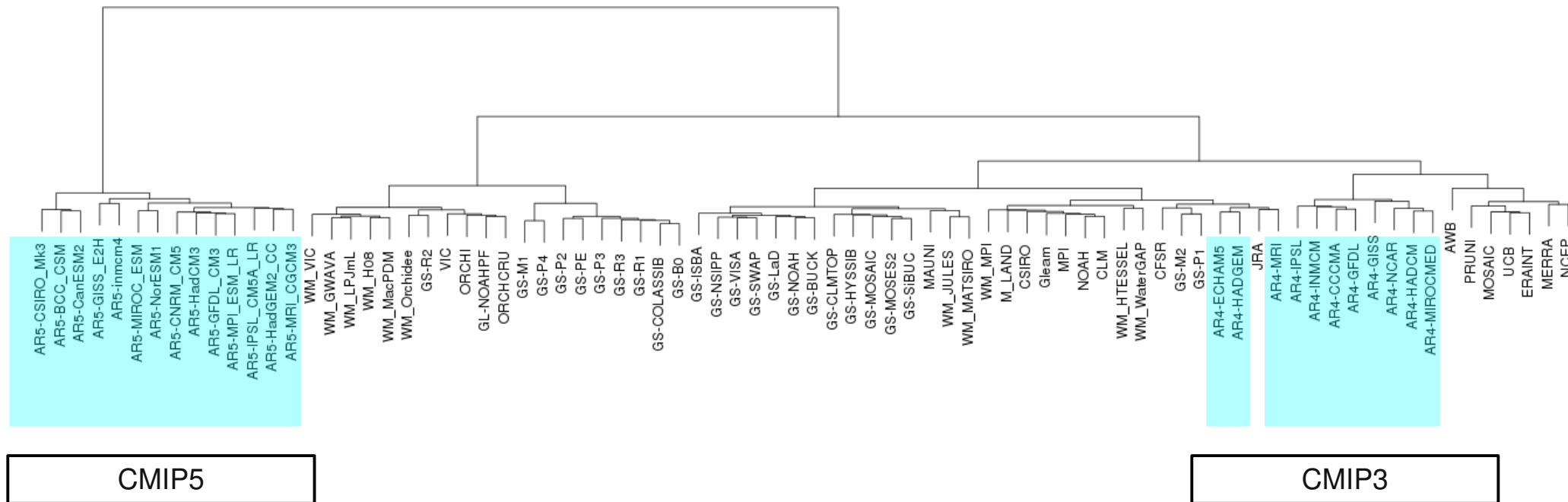
Cluster analysis

Multi-year means 1989-1995,
euclidean distance



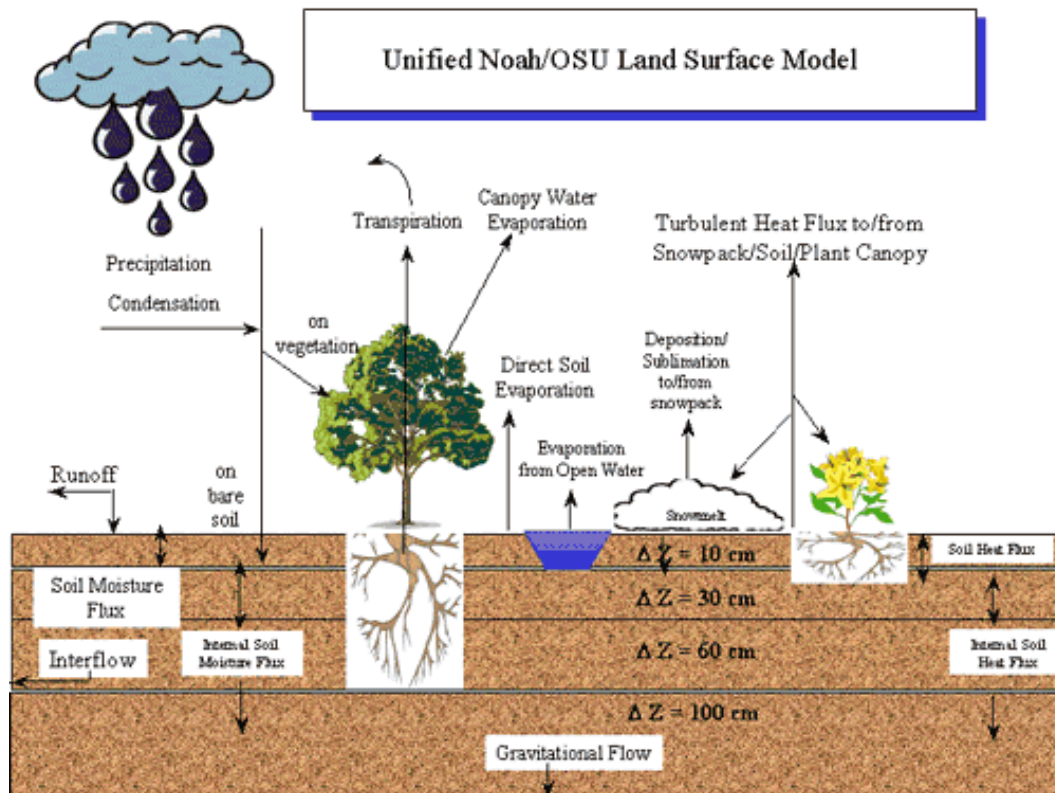
Cluster of multi-year mean ET

IPCC simulations in the cluster tree



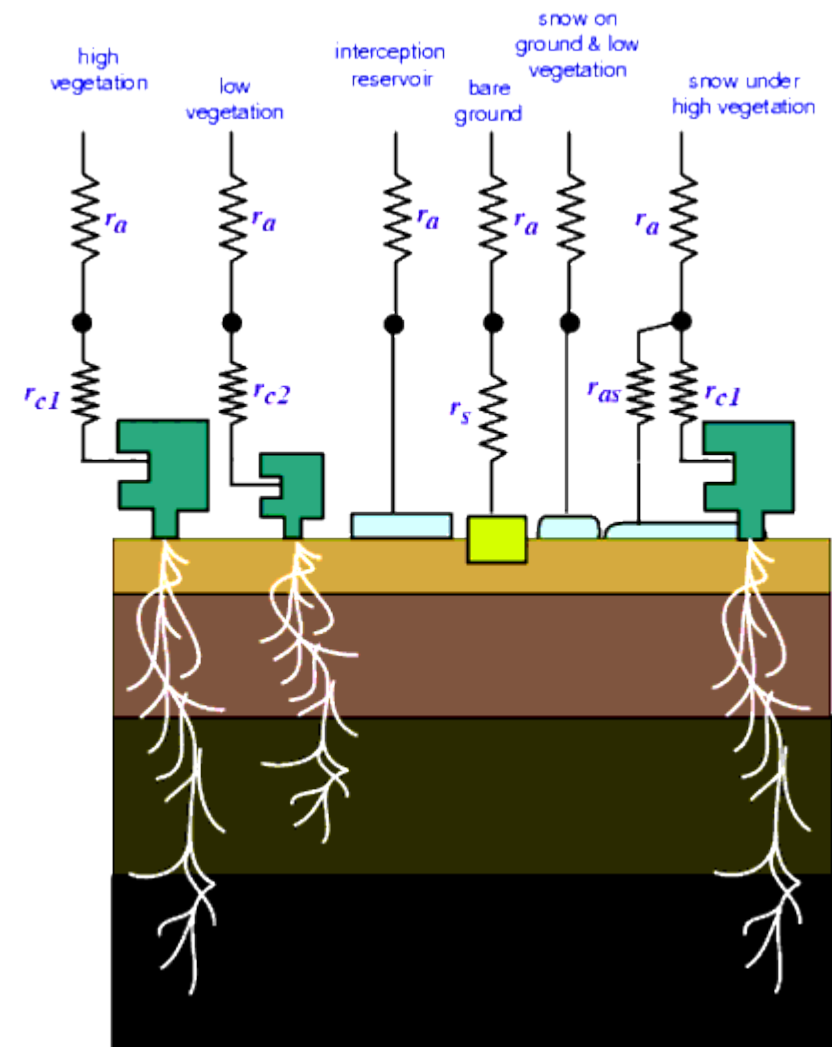
ET in reanalyses

Land-surface model: Model land interactions with the atmosphere (partitioning of net radiation into latent and sensible heat)



NOAH/OSU (NCAR)

Schematics of the land surface



TESSEL (ECMWF)