

A Multi-model Analysis for CEOP: Surface Fluxes

Michael Bosilovich, David Mocko

John Roads and Alex Ruane

Data contributions from

BMRC, CPTEC, ECPC, JMA, MSC, NCEP and UKMO

And ECMWF and GMAO

Recently printed in JHM; supported by NASA Modeling, Analysis and
Prediction Program

Melbourne Australia, August 2009

Phase I Global Analyses

- Coordinated Enhanced Observing Period – EOP 3 and 4, Oct 2002-Dec 2004
- 8 (now 10) global analyses archived at MPI (~5.7 TB, native grids/forecast cycles)
- Limited access or use by the science activities in CEOP
- Need to process the data to a more uniform usable format

Multi-model Analysis for CEOP (MAC)

Objective

- To homogenize the differences in the data structure, facilitating comparisons and evaluations with independent data
- Focus on the physical processes (especially W&E)
- To produce an ensemble mean and variance data set that may support CEOP science activities
- **Hypothesis:** Since the input observations are closely related, an ensemble mean should minimize uncorrelated model background error and bias
 - For example: Dirmeyer et al. (2006, GSWP), Philips and Gleckler (2006), Compo et al. (2006)

Multi-model Analysis for CEOP (MAC)

- Each of 8 systems provides 6 hourly analyses, largely the same input observations with different DA methods
 - Some important differences among members
- Unified Dataset
 - 1.25 degree global spatial resolution
 - Monthly, daily, and 6 hourly time series – For all 8 (now 10!) members, ensemble mean and std. dev.
 - NetCDF and Grib online, Binary in archive
- Issues in developing the Ensemble
 - Missing data, spatial resolution, temporal averaging, analysis vs. forecast, occasional bugs, P Surface intersecting the topography, variable names

Full EOP 3-4 time series (Monthly)

Precipitation w.r.t. GPCP

CMAP

Ave = 1.029

MAC

Ave = 1.617

JMA

Ave = 2.217

UKMO

Ave = 2.023

NCEP

Ave = 2.222

MSC

Ave = 2.068

ECPC-RII

Ave = 2.566

ECPC-SFM

Ave = 2.076

CPTEC

Ave = 2.467

BMRC

Ave = 2.842

Precipitation w.r.t. GPCP

CMAP

Ave = 0.938

MAC

Ave = 0.878

JMA

Ave = 0.800

UKMO

Ave = 0.848

NCEP

Ave = 0.864

MSC

Ave = 0.789

ECPC-RII

Ave = 0.757

ECPC-SFM

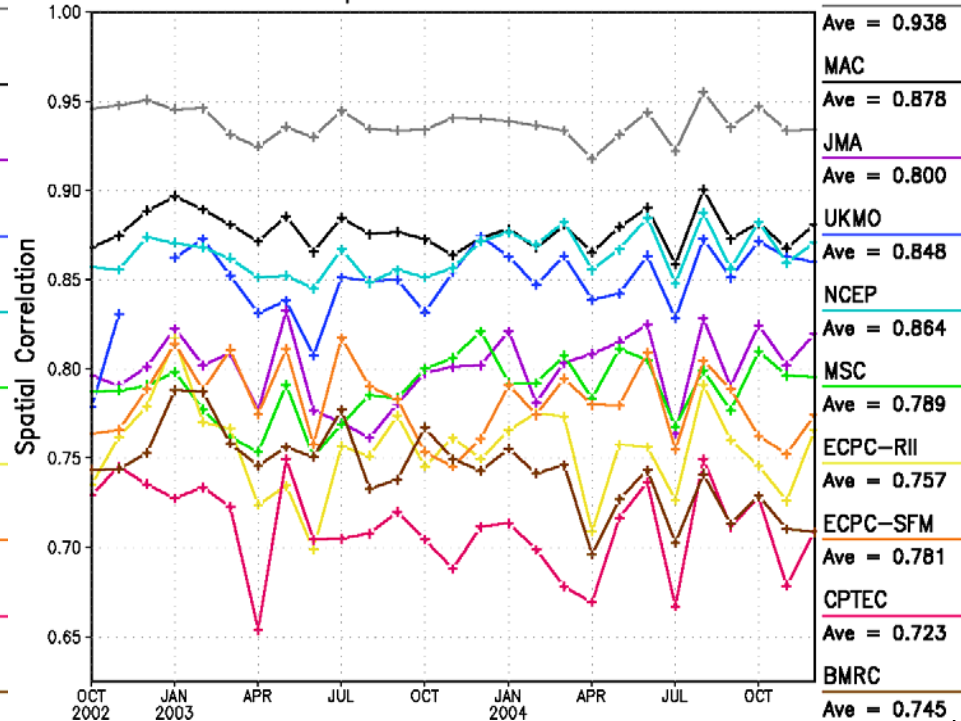
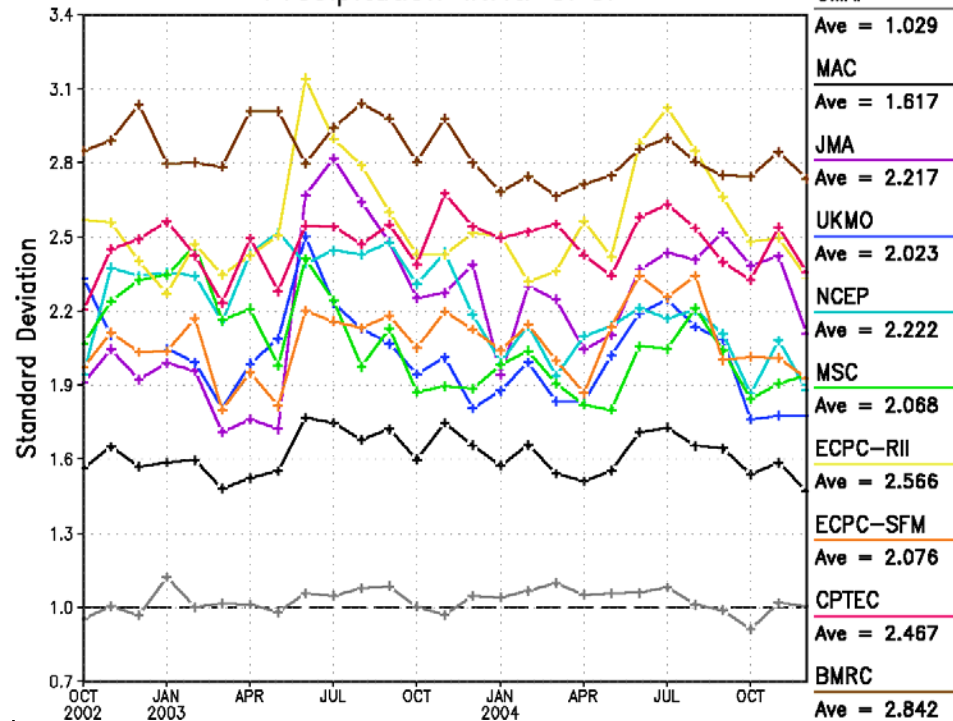
Ave = 0.781

CPTEC

Ave = 0.723

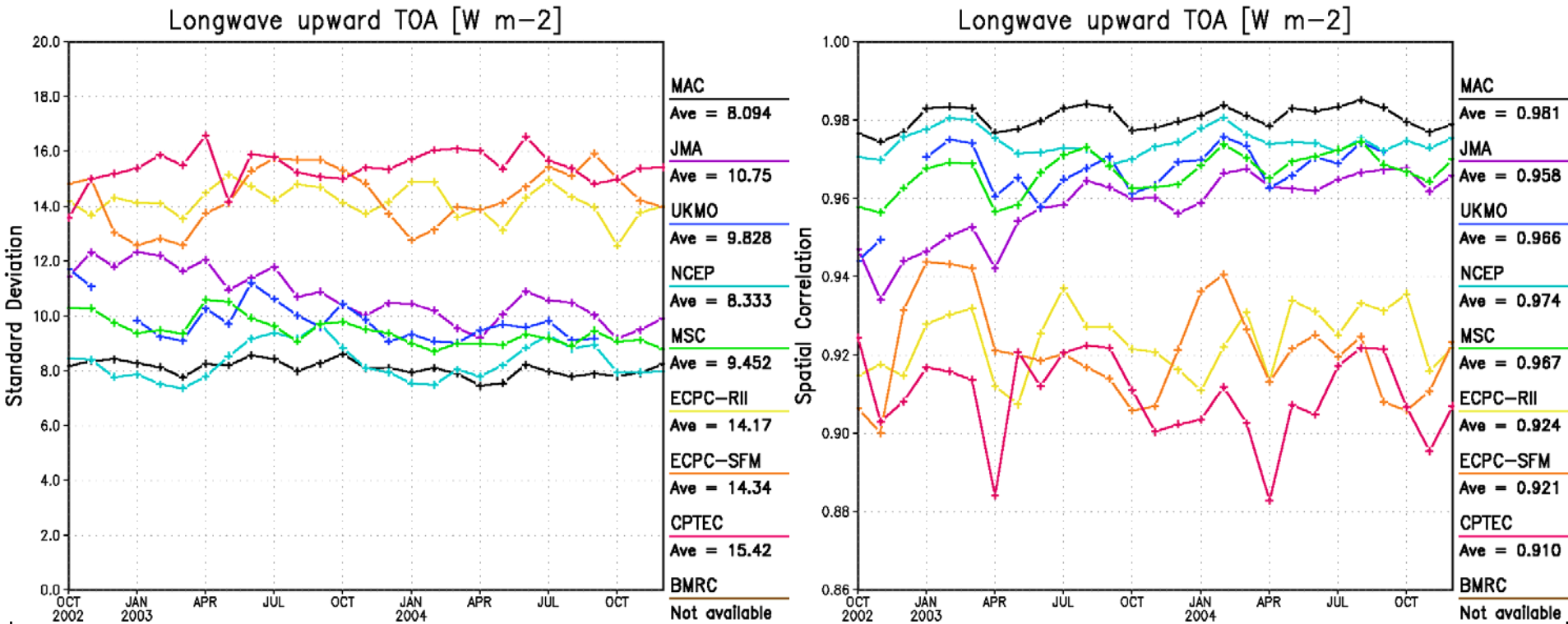
BMRC

Ave = 0.745



- Global spatial statistics of MAC precipitation compared to GPCP

Full EOP 3-4 time series (Monthly)

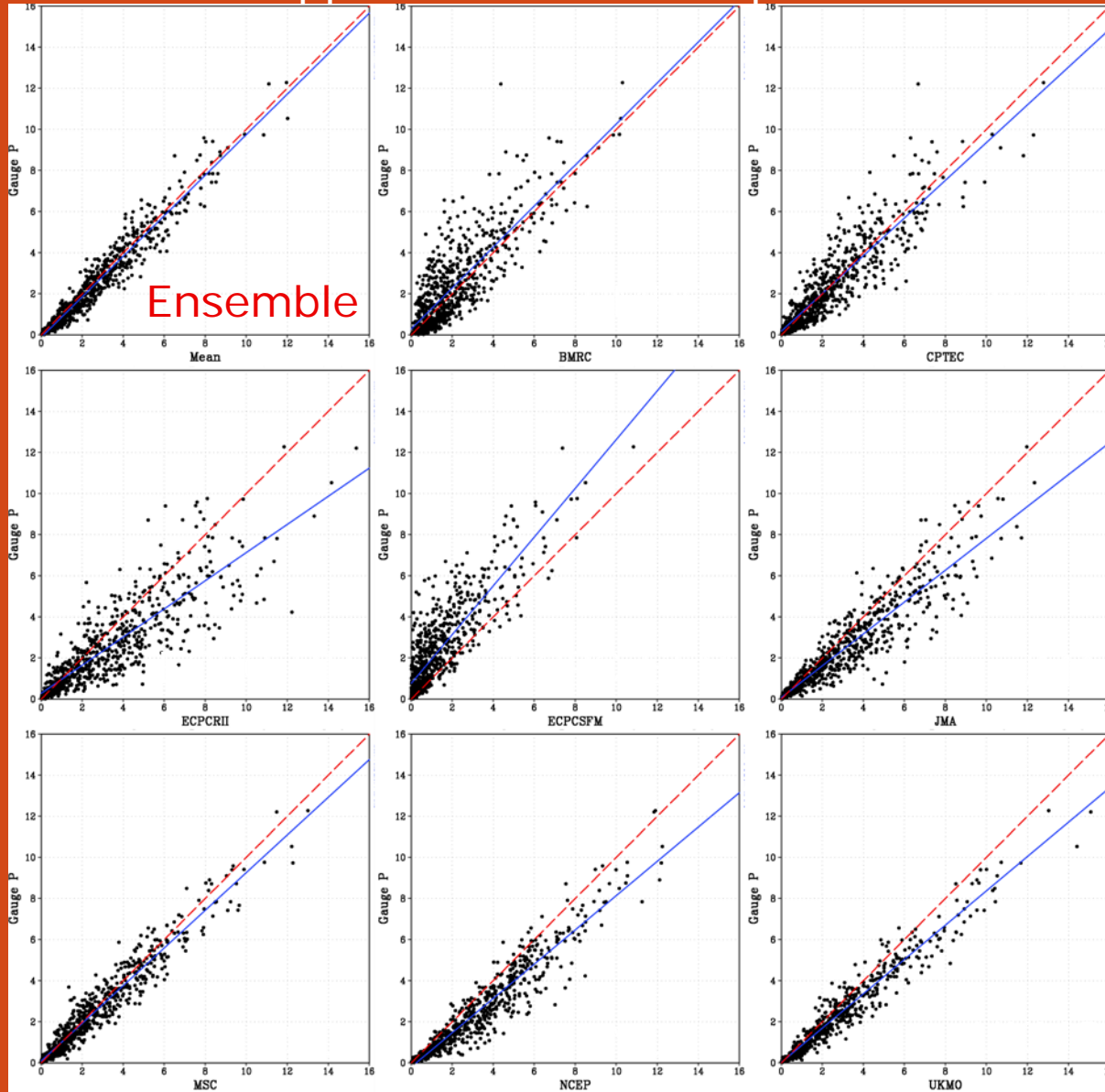


- Global spatial statistics of MAC TOA OLR compared to SRB

Mississippi River Basin Precipitation

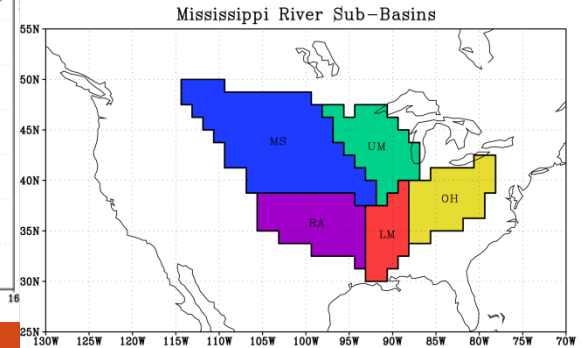
CEOP EOP 3-4 Daily MRB Precipitation

- Precipitation is independent (not assimilated)
- In general, Models have different characters
- Most overestimate high rain events
- Daily spatial correlations highest in the ensemble



Ensemble

Analysis



Mississippi River Sub-Basins

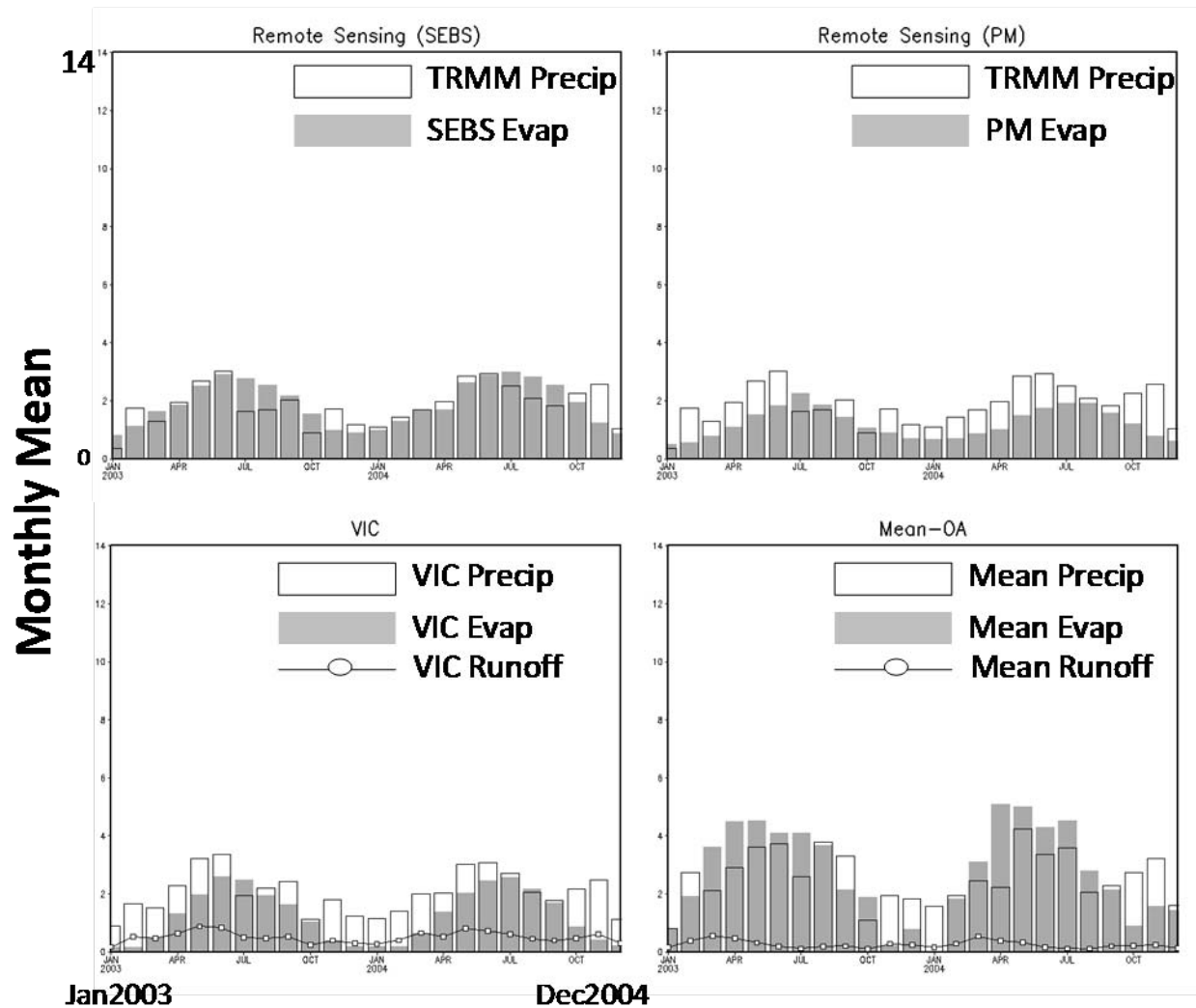
Gauge Observations

Comparison with SEBS ET

Vinukollu and Wood

- SEBS – Multi-sensor (CERES AIRS, MODIS) derived land surface evaporation

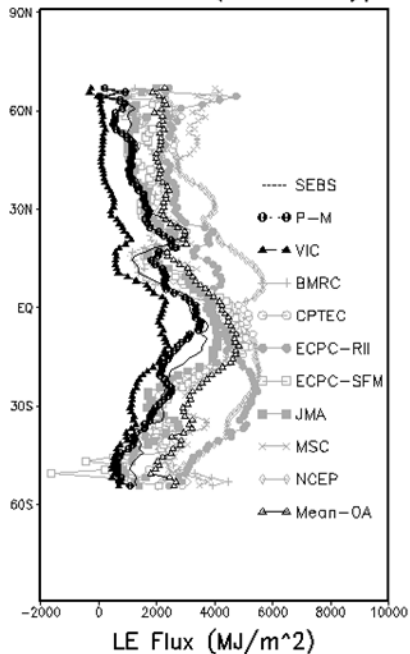
Mississippi Basin



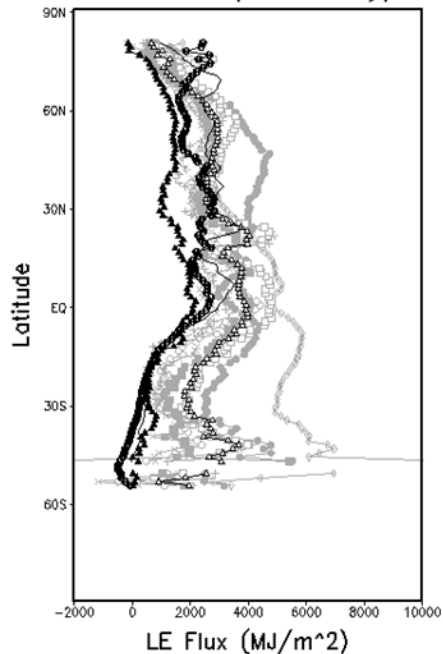
Zonal and Seasonal SEBS LE

- Multi-model mean compares well in summer seasons, and less so in winter seasons (high bias)
- Still undergoing statistical comparisons

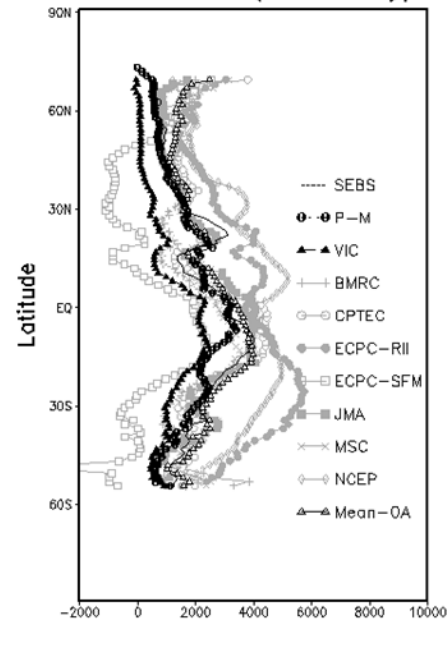
JFM-2003 (Land-only)



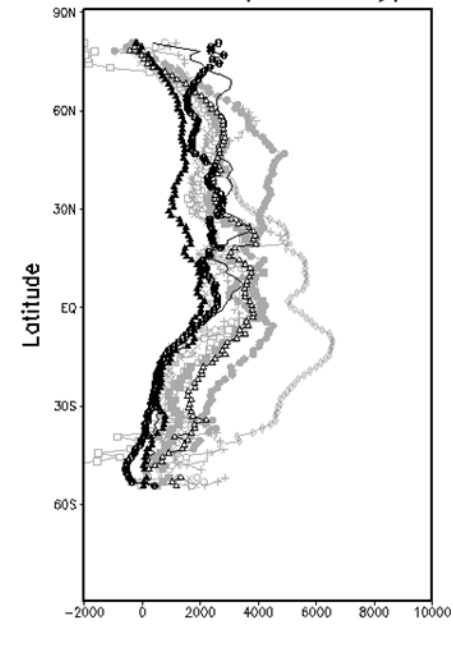
JJA2003 (Land-only)



JFM-2004 (Land-only)



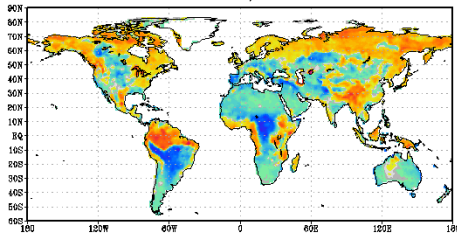
JJA2004 (Land-only)



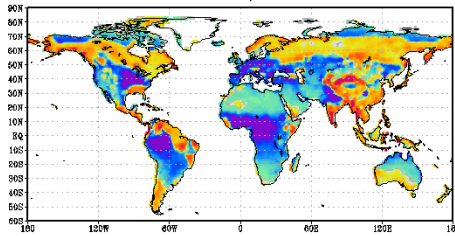
200407 Latent heat flux (W/m^2)

MERRA

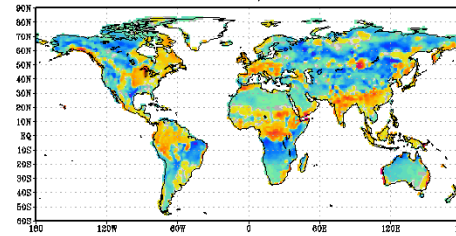
MERRA - MAC
aave = -2.00, sd = 23.43



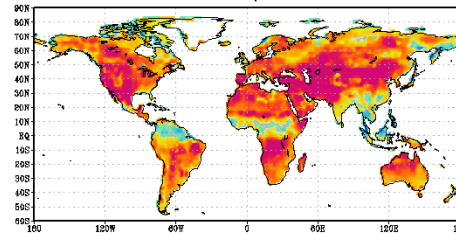
BMRC - MAC
aave = -13.4, sd = 37.38



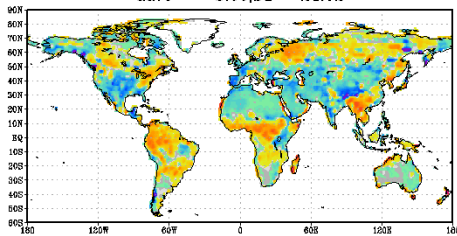
CPTEC - MAC
aave = -8.12, sd = 23.31



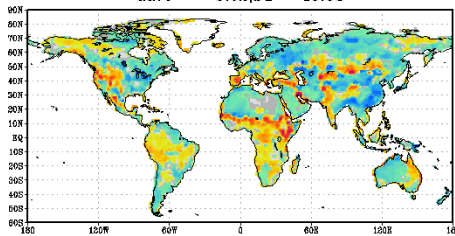
ECPC-R11 - MAC
aave = 35.38, sd = 35.01



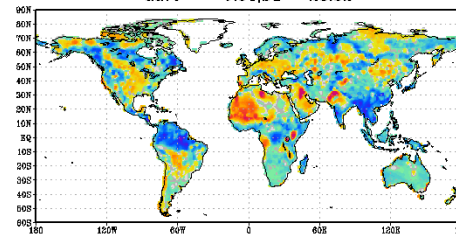
ECPC-SFM - MAC
aave = -3.66, sd = 21.72



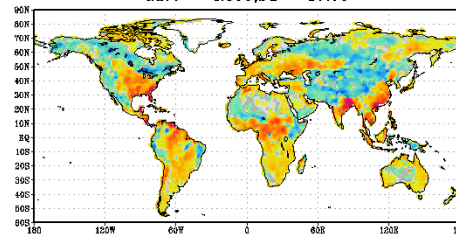
JMA - MAC
aave = -3.02, sd = 19.08



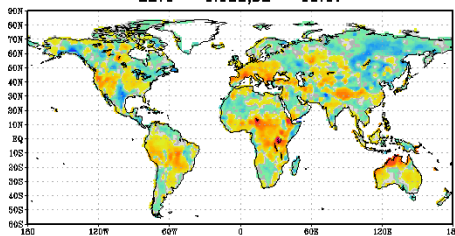
MSC - MAC
aave = -9.51, sd = 23.52



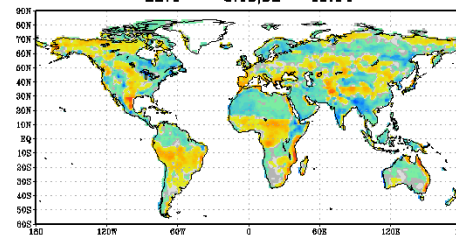
NCEP - MAC
aave = 4.899, sd = 19.75



UKMO - MAC
aave = 0.638, sd = 16.17



ECMWF - MAC
aave = -3.13, sd = 15.14

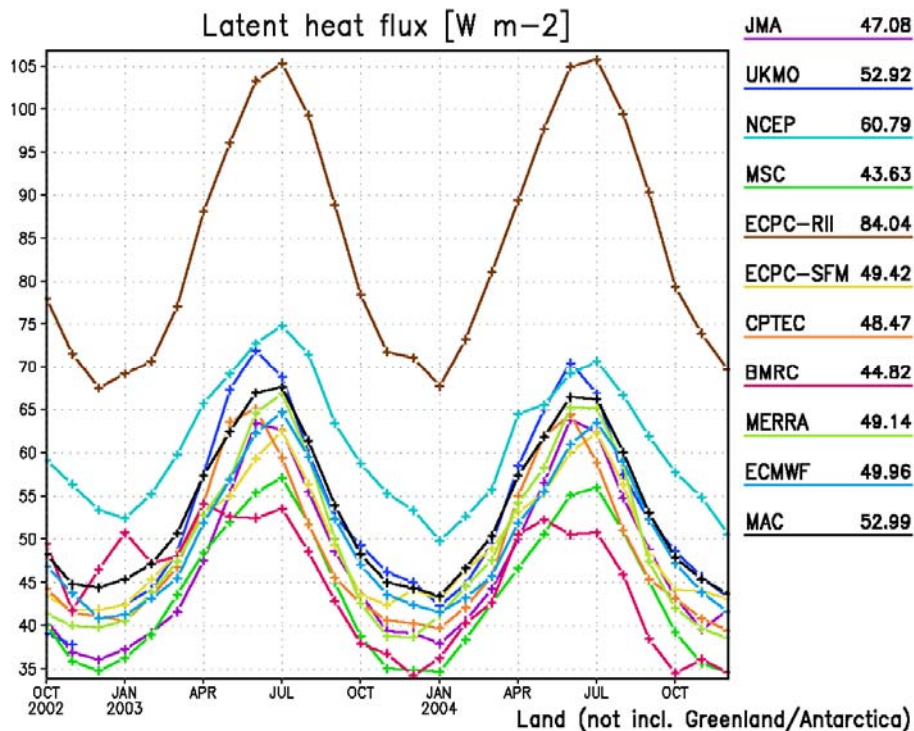


ERA Interim

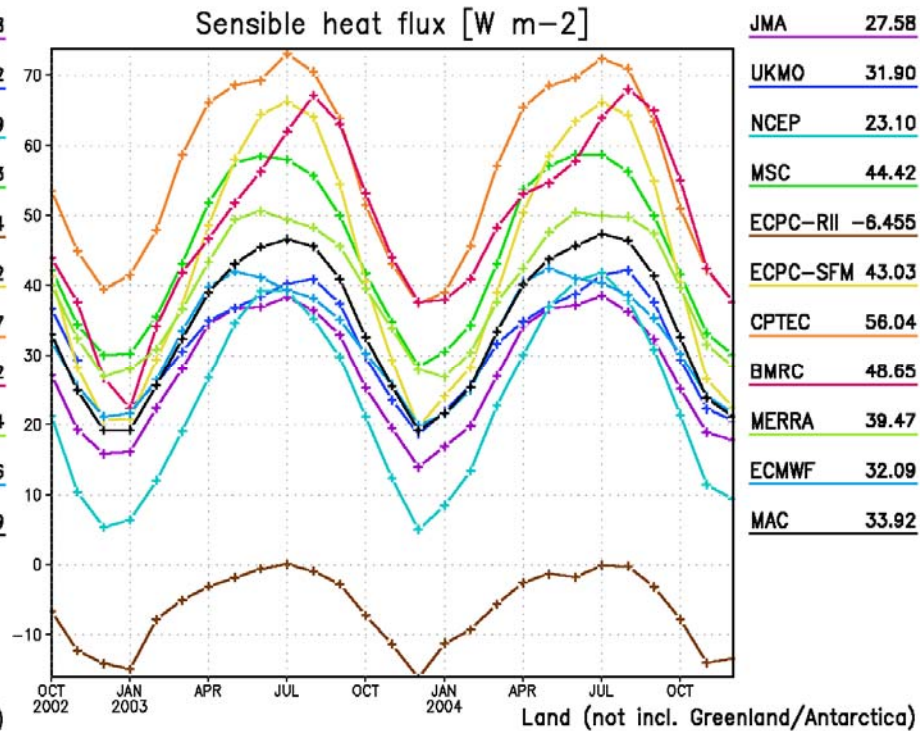
- Just starting to work with Version 2 – 10 member data set
- Differences from the 10 member ensemble average
- Range of +/- 75 W/m^2 in the monthly mean difference
- ERA Interim is the closest to the ensemble mean

Global Land-only Monthly Series

Latent Heat Flux



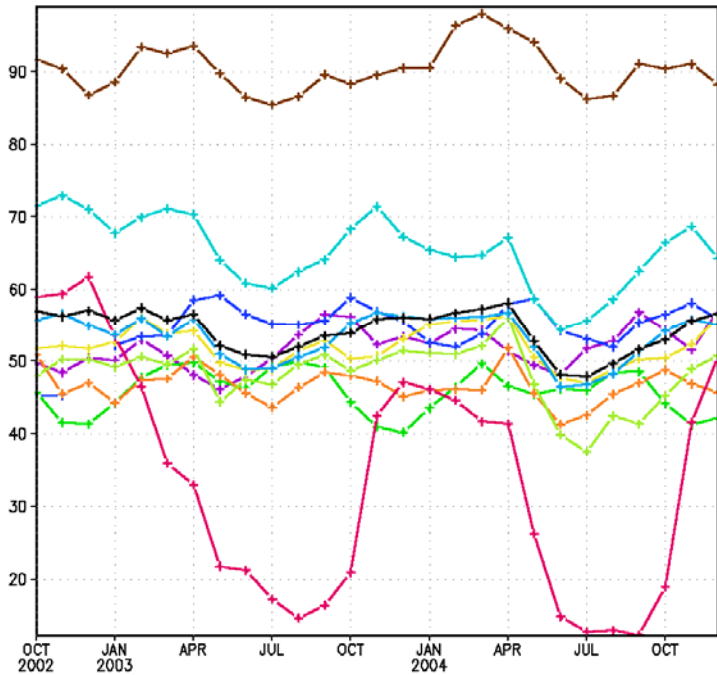
Sensible Heat Flux



- The spread of values allows calculation of the uncertainties
- Greenland/ Antarctica excluded from land integration

North American Land Fluxes

Latent heat flux [W m^{-2}]



JMA 51.92

UKMO 54.68

NCEP 65.37

MSC 45.77

ECPC-RII 90.44

ECPC-SFM 52.04

CPTEC 46.67

BMRC 33.90

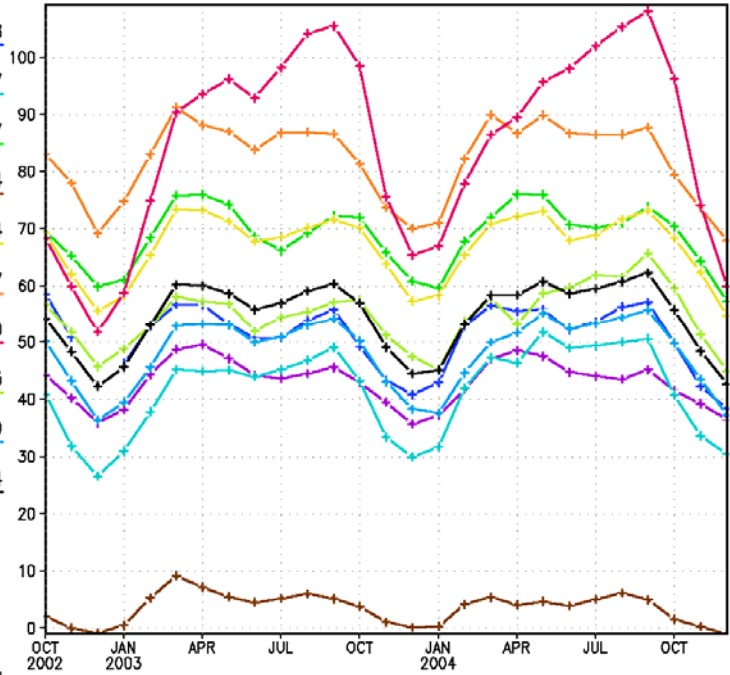
MERRA 48.25

ECMWF 53.39

MAC 54.24

North America

Sensible heat flux [W m^{-2}]



JMA 43.03

UKMO 51.30

NCEP 41.40

MSC 68.70

ECPC-RII 3.550

ECPC-SFM 66.88

CPTEC 81.94

BMRC 85.00

MERRA 54.71

ECMWF 48.12

MAC 54.42

North America

- For NA, most centers fluxes have similar cycles and patterns in the time series, with a with range of means

Global Land Energy

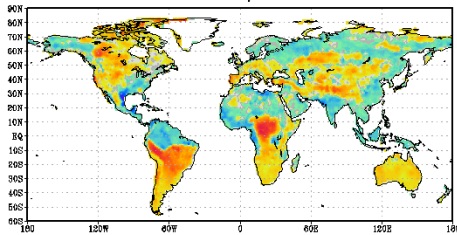
b) Land	LH	SH	RLd _{sfc}	RLu _{sfc}	RSd _{sfc}	RSu _{sfc}	RLu _{toa}	RSd _{toa}	RSu _{toa}	Net _{sfc}	Net _{toa}	Precip
BMRC	51	46	326	401	212	40	-	-	-	0.1	-	2.40
CPTEC	55	54	333	401	224	44	253	-	106	2.3	-15.3	2.46
ECPC-RII	87	-3	322	393	208	42	246	343.2	105	12.4	-7.5	2.81
ECPC-SFM	54	42	313	396	232	45	255	343.2	89	7.4	-0.6	1.95
JMA	53	27	301	391	219	46	260	343.1	95	1.7	-11.9	2.45
MSC	49	43	319	392	206	43	250	342.0	103	-2.6	-10.5	2.34
NCEP	65	23	322	392	208	44	249	-	101	5.8	-7.2	2.84
UKMO	58	31	328	396	196	38	240	343.4	104	1.2	-0.9	2.64
MAC	59	33	320	395	214	43	250	343.0	100	3.5	-7.8	2.48
Sdev	12.2	18.0	9.9	3.9	11.3	2.7	6.3	0.5	6.1	4.8	5.5	0.28
TFK	39	27	304	383	185	40	232	330.2	113	0.0	-15.6	-
SRB/GPCP	-	-	329	402	192	35	243	343.1	-	-	-	2.30

- Model data are for Jan 2003-Dec 2004
- MAC ensemble average based on 6 hourly means (not the average of global values)
- Sdev is the standard deviation of the models global values
- TFK - Trenberth, Fasullo and Keihl (2009, BAMS)
- P in mm/day, others W/m²
- SRB/GPCP 2003-2004, as in the models, TFK for Mar00-May04, GRFA due soon

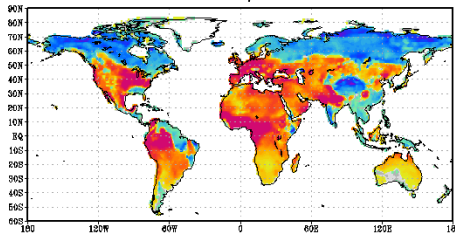
200407 Sensible heat flux (W/m^2)

MERRA

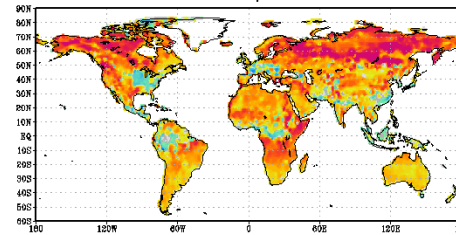
MERRA - MAC
aave = 2.356, sd = 18.47



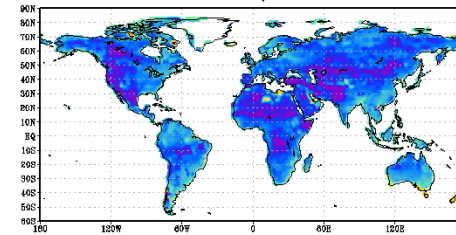
BMRC - MAC
aave = 15.04, sd = 38.92



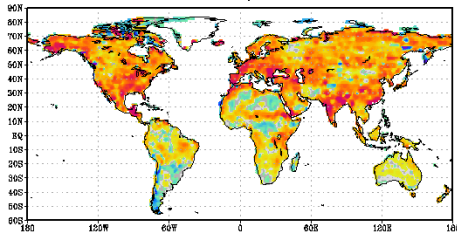
CPTEC - MAC
aave = 22.68, sd = 24.01



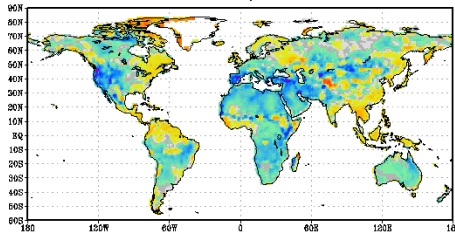
ECPC-R11 - MAC
aave = -43.4, sd = 22.48



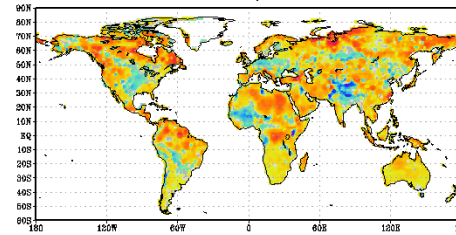
ECPC-SFM - MAC
aave = 16.93, sd = 24.82



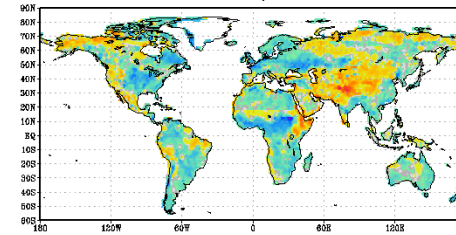
JMA - MAC
aave = -7.91, sd = 16.33



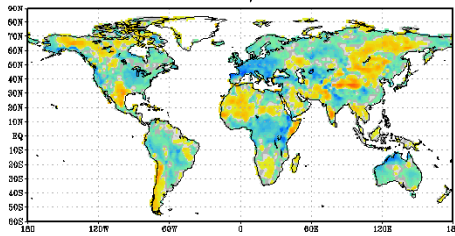
MSC - MAC
aave = 10.58, sd = 18.41



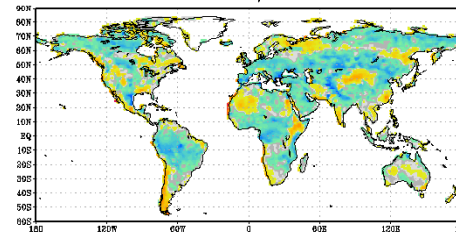
NCEP - MAC
aave = -5.42, sd = 15.71



UKMO - MAC
aave = -5.28, sd = 13.83



ECMWF - MAC
aave = -5.64, sd = 12.99



ERA Interim



- Similar wide range of sensible heat fluxes

Results

- *Monthly comparisons to precipitation and TOA OLR show the variance of the analyses and that the ensemble generally compares the closest*
- Also, noticeable improvements to any individual member has only slight effect on the ensemble
- Selecting only the best skill systems only improve the ensemble results marginally
- *Daily precipitation in the MRB is very well represented by the ensemble*
- This extends to sub-basins and also daily spatial distribution of precipitation

Surface Fluxes

- Sensible and Latent heat vary greatly from system to system
- May also expose serious deficiencies, but care must be taken in determining outliers (something that is an outlier, may actually be more realistic)
- Further comparisons among surface flux data sets (satellite based and LDAS based)
- Ensemble average may be representative, but still requires validation and improvements
- An ensemble approach allows estimates of uncertainty

Summary

- Comparing models to a single analysis is clearly inadequate
- The variance in the ensemble appears to be unacceptably high; should be monitored, allowing feedback to centers
 - Still Selective Ensembles have only small improvement
- GMAO and ECMWF contributions have been added to Version 2
- <http://gmao.gsfc.nasa.gov/research/modeling/validation/ceop.php>

Data info and download:

<http://gmao.gsfc.nasa.gov/research/modeling/validation/ceop.php>

Thank you for your time!

CEOP Global Analyses, GEWEX SSG, Irvine
CA, 21 January 2009

Implications of this Work

- GEWEX Objectives 1 & 2: A data set that can be used to better understand W&E cycles and contributes to the RHPs and focus studies
- Ken Mitchell (NCEP) and Paul Earnshaw (UKMO) have copied the data and is using it in their system evaluations
- Kun Yang (WEBS) and W. Guo (S-A) have copied the data for use in their contributions to CEOP

Next Steps

- Provides impetus to continue or expand the efforts tested in the CEOP Global modeling group
- **Un-Acronymed Project in 2013**: An effort to collect and synthesize a multitude of international operational analyses for weather and ultimately climate model development (e.g. AMIP or IPCC)
 - Need commitments from NWP centers, not just data, but formatting, and documentation
 - Can or will TIGGE data be augmented to include physical process data used in GEWEX studies?
 - Can we enhance the archive site to handle the reformatting of the model analyses and forecasts? Probably with input from the contributing centers (PCMDI utilities?)

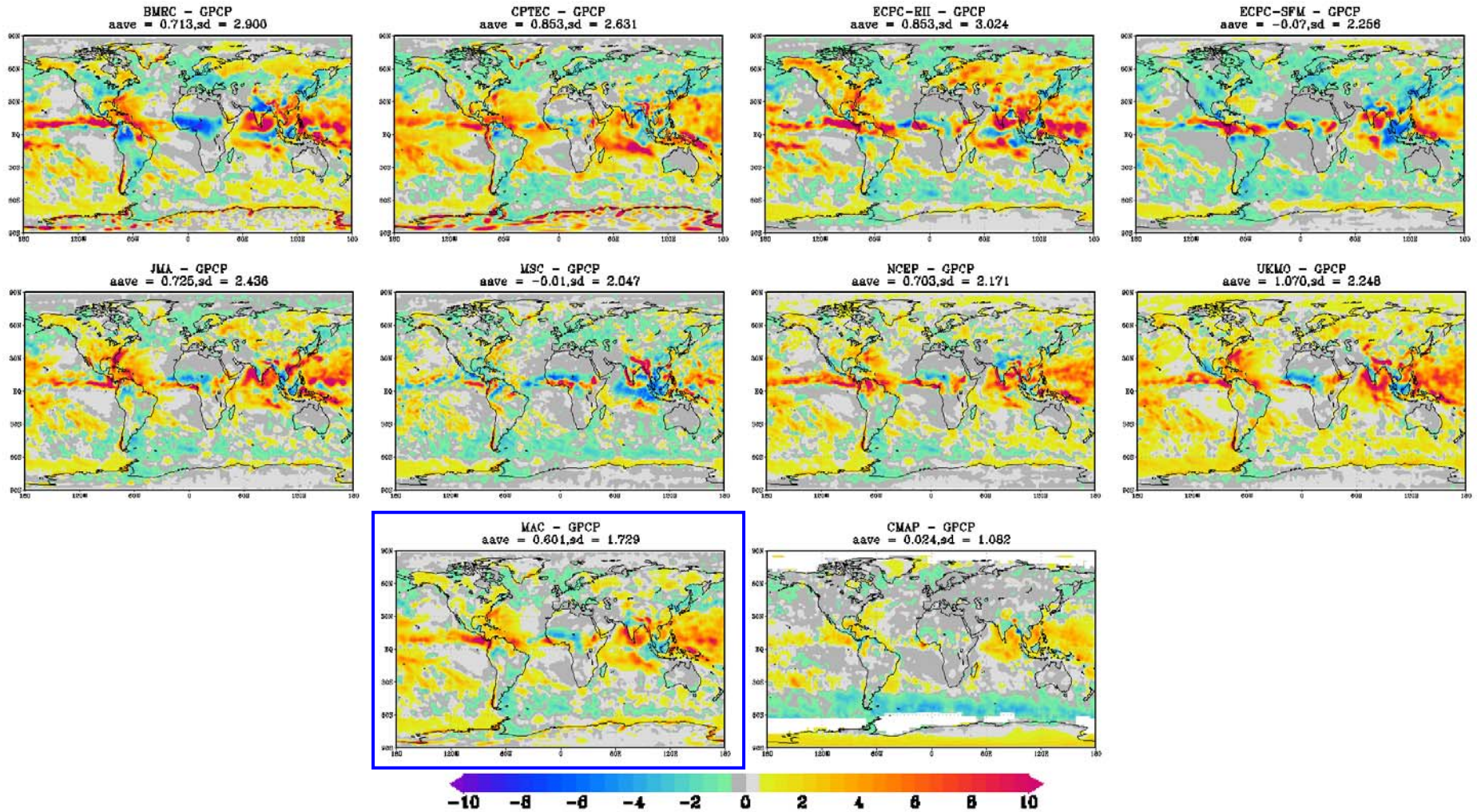
Benefits for Weather and Climate

- About the quality of current reanalyses, **plus** uncertainty estimates (useful for metrics)
- Community would have access to centralized analyses of weather data for research
- NWP centers would gain valuable information regarding the multitude of output diagnostics from external research/validation
- Would allow operational centers that cannot produce a reanalysis to contribute to a climate record (in time)

Available Variables

Description	Units	Centers							
		BMRC	CPTEC	ECPCRII	ECPCFSM	JMA	MSC	NCEP	UKMO
Surface Pressure	Pa	SURFPsfc	PRESsfc	PRESsfc	PRESsfc	PRESsfc	SURFPsfc	PRESsfc	SURFPsfc
Mean Sea Level Pressure	Pa	MSLPsfc		PRMSLmsl	PRESmsl				PRMSLmsl
Surface Air Temperature	K	TMP2m	TMP2m	TMP2m	TMP2m	TMP2m	TTSUsfc	TMP2m	LOWT2m
Surface Skin Temperature	K	SURFTsfc	SURFTsfc	TMPsfc	TMPsfc		SURFTsfc	TMPsfc	SURFTsfc
Surface Air Moisture	kg kg ⁻¹	SPFH2m	RH2m	SPFH2m	SPFH2m	SPFHhbl	HUSUsfc	SPFH2m	LOWSH2m
Surface Eastward Wind	m s ⁻¹	UGRD10m	UGRD10m	UGRD10m	UGRD10m	UGRD10m	UUSUsfc	UGRD10m	TENUS10m
Surface Northward Wind	m s ⁻¹	VGRD10m	VGRD10m	VGRD10m	VGRD10m	VGRD10m	VVSUsfc	VGRD10m	TENVS10m
Precipitation	kg m ⁻² s ⁻¹	APCPsfc	APCPsfc	PRATEsfc	PRATEsfc	PRATEsfc	PRsfc	PRATEsfc	APCPsfc
Convective Precipitation	kg m ⁻² s ⁻¹			CPRATsfc	CPRATsfc				ACPCPsfc
Surface Runoff	kg m ⁻²		WATRsfc	WATRsfc	WATRsfc		N0sfc	WATRsfc	WATRsfc
Liquid equivalent snow depth	kg m ⁻²	SNODsfc		WEASDsfc	WEASDsfc		I5sfc	WEASDsfc	
Latent Heat Flux	W m ⁻²	LHTFLsfc	LHTFLsfc	LHTFLsfc	LHTFLsfc	LHTFLsfc	AVsfc	LHTFLsfc	LHTFLsfc
Sensible Heat Flux	W m ⁻²	SHTFLsfc	SHTFLsfc	SHTFLsfc	SHTFLsfc	SHTFLsfc	AHsfc	SHTFLsfc	SHTFLsfc
Surface Incoming Shortwave	W m ⁻²	DSWRFsfc	DSWRFsfc	DSWRFsfc	DSWRFsfc	DSWRFsfc	N4sfc	DSWRFsfc	TDSWSsfc
Surface Incoming Longwave	W m ⁻²	DLWRFsfc	DLWRFsfc	DLWRFsfc	DLWRFsfc	DLWRFsfc	ADsfc	DLWRFsfc	TDLWSsfc
Surface Reflected Shortwave	W m ⁻²	USWRFsfc	USWRFsfc	USWRFsfc	USWRFsfc	USWRFsfc	N4sfc-A5sfc	USWRFsfc	TUSWSsfc
Surface Outgoing Longwave	W m ⁻²	ULWRFsfc	ULWRFsfc	ULWRFsfc	ULWRFsfc	ULWRFsfc	ADsfc-AIsfc	ULWRFsfc	TULWSsfc
TOA Longwave Outgoing	W m ⁻²		ULWRFtoa	ULWRFtoa	ULWRFtoa	ULWRFtoa	ARsfc	ULWRFtoa	TULWTtoa
TOA Shortwave Incoming	W m ⁻²			DSWRFtoa	DSWRFtoa	DSWRFtoa	ABsfc		TDSWTtoa
TOA Shortwave Outgoing	W m ⁻²		USWRFtoa	USWRFtoa	USWRFtoa	USWRFtoa	AUsfc	USWRFtoa	TUSWTtoa
Total Cloud Cover	(0-1)		TCDCclm	TCDCclm	TCDCclm	TCDCsfc	TCDCsfc	TCDCclm	TCDCsfc
Total Column Water Vapor	kg m ⁻²	PWATclm	PWATclm	PWATclm	PWATclm		IHsfc	PWATclm	
Total Column Condensed Water	kg m ⁻²					CWATprs	IEsfc	CWATclm	
Q850	kg kg ⁻¹	SPFHprs	SPFHprs	SPFHprs	SPFHprs		SPFHprs	RHprs	RHprs
T850	K	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs
U850	m s ⁻¹	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs
V850	m s ⁻¹	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs
H850	m	HGTprs	HGTprs	HGTprs	HGTprs	GPprs	HGTprs	HGTprs	GPprs
Q700	kg kg ⁻¹	SPFHprs	SPFHprs	SPFHprs	SPFHprs		SPFHprs	RHprs	RHprs
T700	K	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs	TMPprs
U700	m s ⁻¹	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs	UGRDprs
V700	m s ⁻¹	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs	VGRDprs

July 2004 Comparison to GPCP



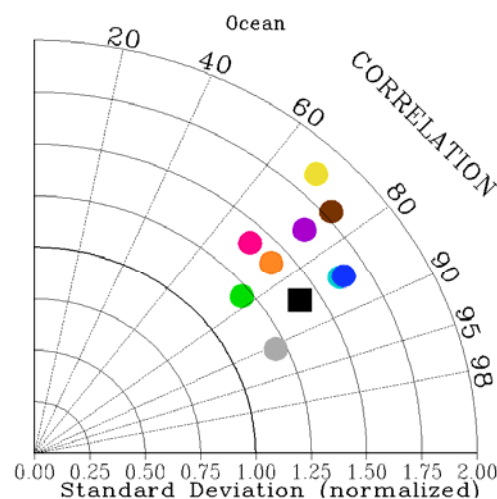
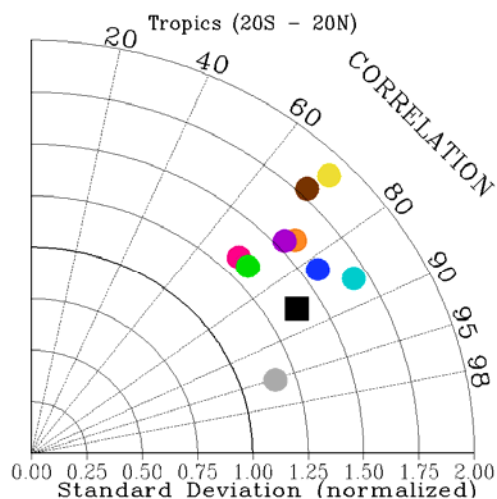
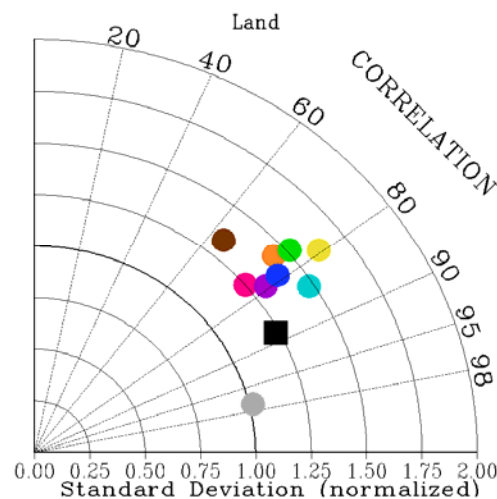
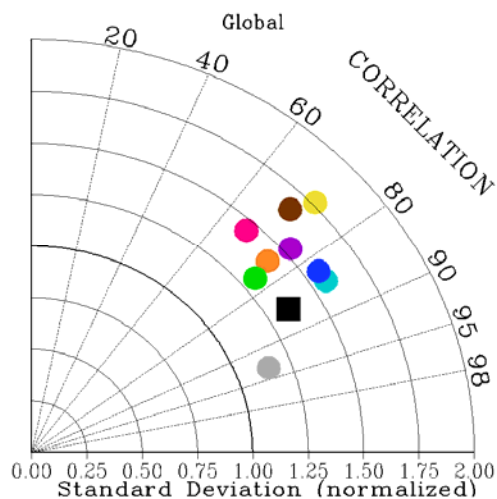
- MAC most closely comparable to spatial pattern of GPCP

CEOP Global Analyses, GEWEX SSG, Irvine
CA, 21 January 2009

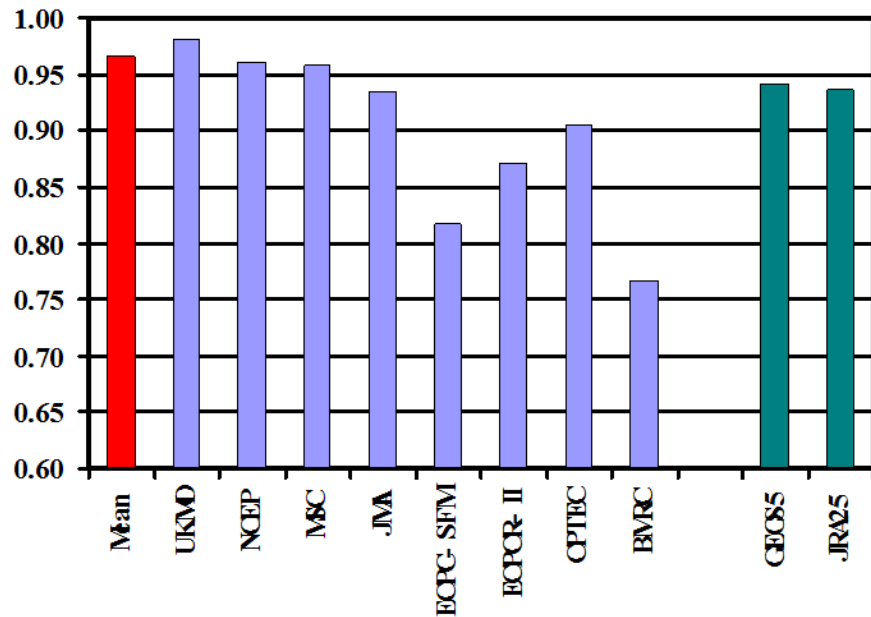
July 2004 Precipitation: Taylor Diagram

- BMRC
- CPTEC
- ECPC-RII
- ECPC-SFM
- JMA
- MSC
- NCEP
- UKMO
- MAC
- CMAP

v. GPCP

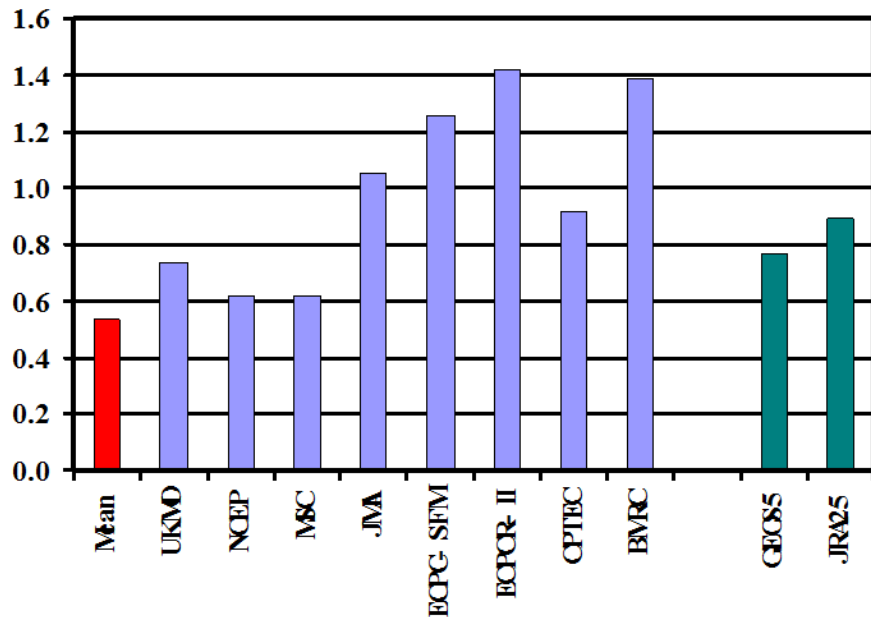


Time Series Correlation

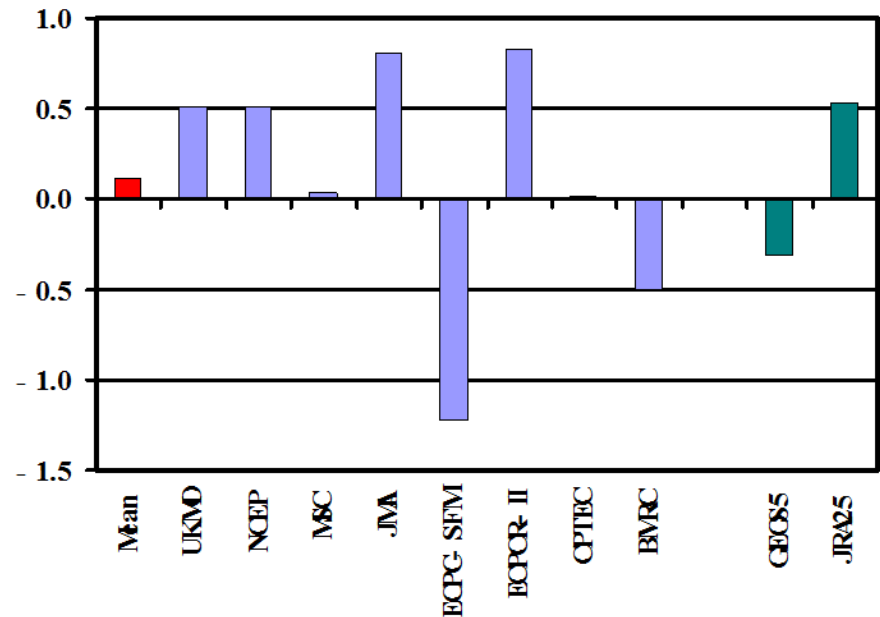


- GEOS5 not up to the highest oper. analyses, but still in range
- Biases happen to balance in the ensemble

Standard Deviation of the Difference



Mean Difference (mm day⁻¹)



MRB Precipitation (mm day⁻¹)

