

# **The Global Land Data Assimilation System (GLDAS): Results and New Directions**

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# LDAS Heritage



## North American LDAS

- NOAA/GAPP and NASA/LSHP 1998-2001
- NOAA/NCEP, GSFC/HSB, and 6 other institutions
- Spin-offs: GLDAS, NLDAS-E
- Mitchell et al., *J. Geophys. Res.*, 2004

## Global LDAS

- NASA/IDS 2000-03; THP discretionary funding 2004-05
- GSFC/HSB and NOAA/NCEP
- Spin-offs: LIS, NEWS/Product Integration
- Rodell et al., *Bull. Amer. Meteor. Soc.*, 2004

## Land Information System (LIS)

- NASA/HPCC 2002-05
- Software adopted by all other GSFC LDAS projects
- Kumar, Peters-Lidard, et al., *Environ. Model. Soft.*, 2005

**“Integration of Energy and Water Cycle Research Products in a Global Land Surface Modeling and Assimilation System”**

- NEWS 2005-10 (PI: M. Rodell)



# NEWS “Integration” Project Overview



***Hypothesis:* Large scale land surface processes cannot be skillfully represented and described without a comprehensive approach, which integrates the best water and energy cycle observations as data for parameterizing, forcing, constraining, and evaluating sophisticated land surface models (LSMs).**

## *Objectives:*

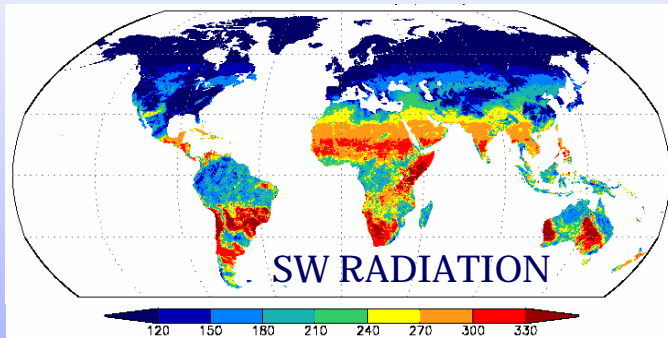
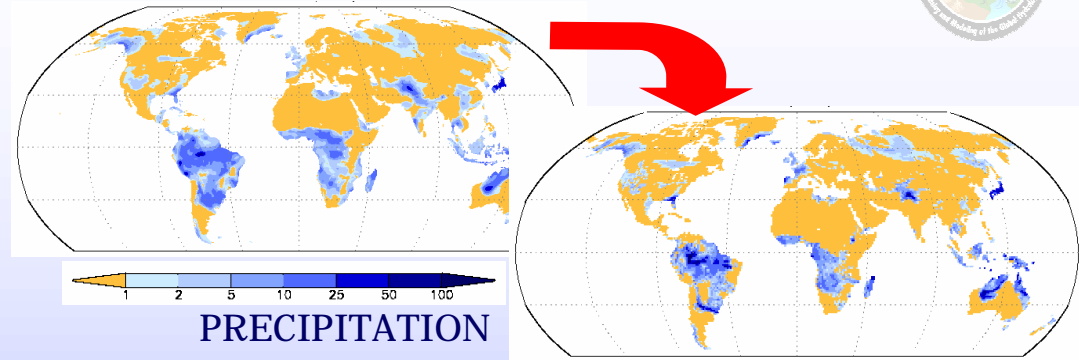
- Implement mature assimilation capabilities within LIS, including schemes for AMSR soil moisture (e.g., Zhan et al., 2004) and snow water equivalent (e.g., Sun et al., 2004), MODIS snow cover (e.g., Rodell and Houser, 2004), and geostationary satellite IR surface temperature (e.g., Bosilovich et al., 2004; Radakovich et al., 2001)
- Incorporate new data products as parameters and forcing
- Utilize a runoff routing scheme
- Include subgrid precipitation variability
- Assess impacts/interactions of each new dataset and capability
- Produce long term, global LSM analyses and associated uncertainty assessments, using multiple configurations with each of the linked LSMs
- Based on these, characterize regional, seasonal to interannual variability in the stocks and fluxes of the water and energy cycles



# Data Integration

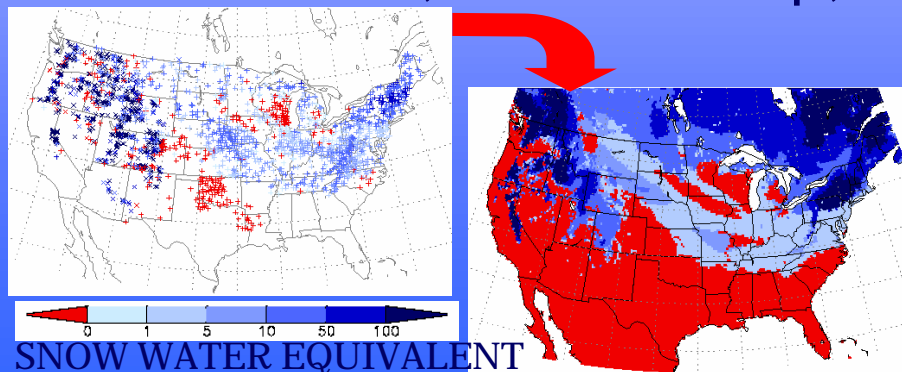
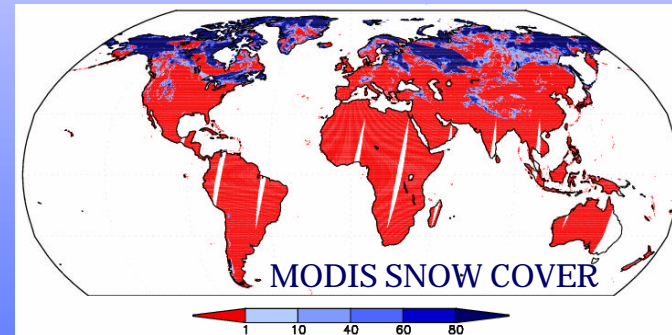


INTERCOMPARISON and  
OPTIMAL MERGING of  
global data fields



Satellite data products used to  
PARAMETERIZE and FORCE  
sophisticated land surface models

ASSIMILATION of satellite based  
land surface state fields (snow,  
soil moisture, surface temp, etc.)



Ground-based observations  
(e.g., CEOP) used to  
EVALUATE model output



# GLDAS Data Archive



Type of Data	Source	Original Spatial Resolution	Time Period	Near Real-Time
Modeled Forcing	NASA Goddard Earth Observing System (GEOS)	1.0°	12/2000 – present	+
	NOAA Global Data Assimilation System (GDAS)	~ 0.7°	1/1999 – present	+
	ECMWF forecasts and analyses	~ 39 km	10/2001 – present	+
	Berg et al. (2002) bias corrected ECMWF reanalysis	0.5°	1/1979 – 12/1993	
	Berg et al. (2002) bias corrected NCEP/NCAR reanalysis	0.5°	1/1985 – 12/1993	
Observation-Based SW and LW Radiation Forcing	Derived at NASA/GSFC using U.S. Air Force Weather Agency cloud and snow analyses	0.25°	3/2001 – present	+
Observation-Based Precipitation Forcing	U.S. Naval Research Laboratory	0.25°	4/2001 – present	+
	NASA/GSFC Mesoscale Atmospheric Processes Branch	0.25°	3/2002 – present	+
	NOAA Climate Prediction Center	2.5°	1/1979 - present	
Observation-Based Snow Cover	Derived at NASA/GSFC using Terra-MODIS satellite observations	0.125°	11/2000 - present	
Observation-Based Leaf Area Index	Boston University Department of Geography	16 km	7/1982 – 5/2001	
Observation-Based Surface Temperature	Television Infrared Observation Satellites (TIROS) Operational Vertical Sounder (TOVS)	~ 15 km	1/1998 – 12/1998	
Vegetation Class	University of Maryland, AVHRR-derived	1 km	static	
	Boston University, MODIS-derived	1 km	static	
Soils	USDA Agricultural Research Service	5'	static	
Elevation	GTOPO30 digital elevation model	30"	static	

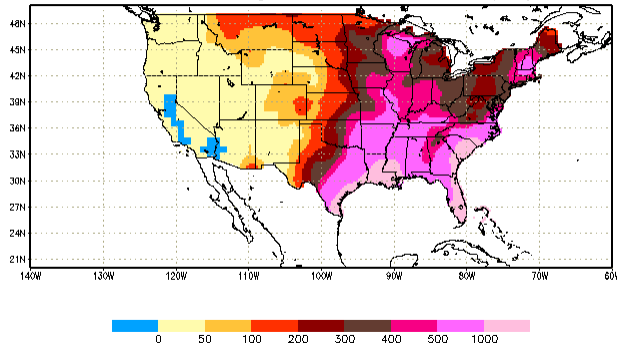
Output includes 0.25 ° and 1 ° global, 1979-present simulations with 3 LSMs: CLM2, Mosaic, and Noah 2.7.1 (*contact [Matthew.Rodell@nasa.gov](mailto:Matthew.Rodell@nasa.gov)*)



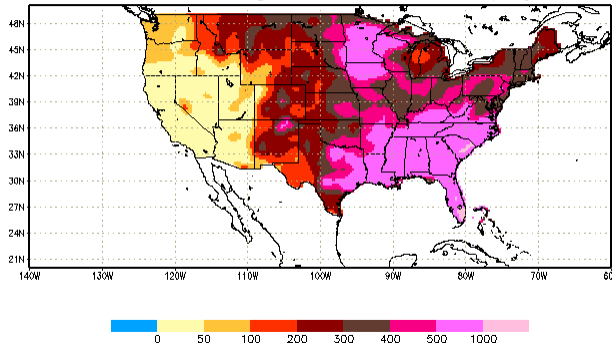
# Intercomparison of Data Fields: Precipitation



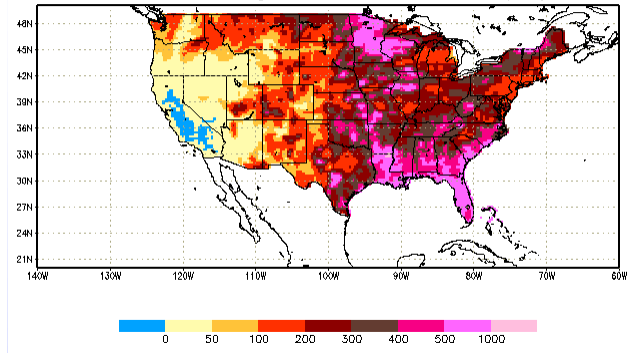
Jun 2002 - Aug 2002 GEOS Total Pcp (MM)



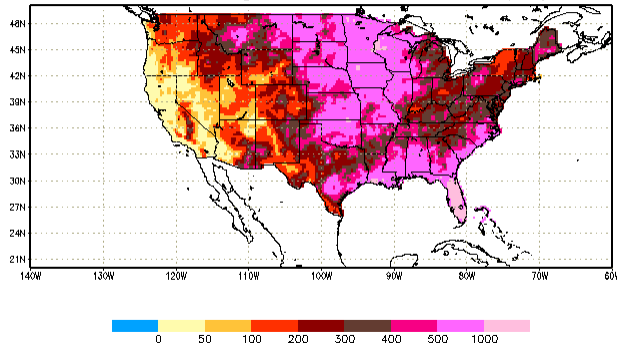
Jun 2002 - Aug 2002 GDAS Total Pcp (MM)



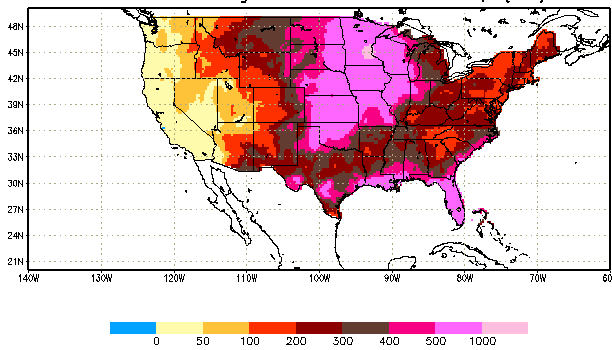
Jun 2002 - Aug 2002 ECMWF Total Pcp (MM)



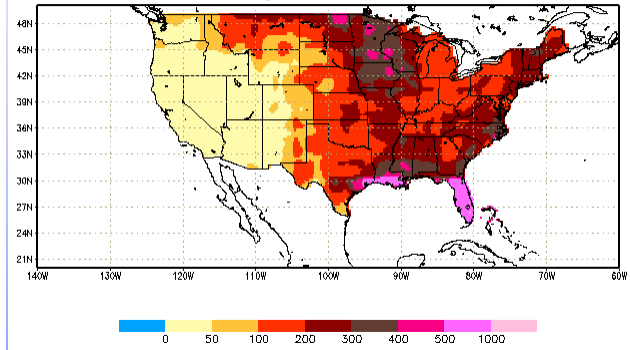
Jun 2002 - Aug 2002 Huffman Total Pcp (MM)



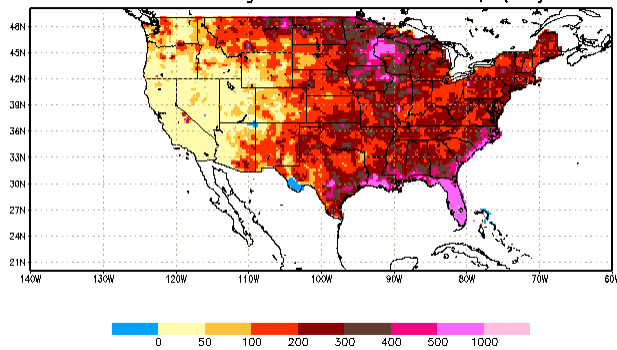
Jun 2002 - Aug 2002 Persiann Total Pcp (MM)



Jun 2002 - Aug 2002 CMAP Total Pcp (MM)

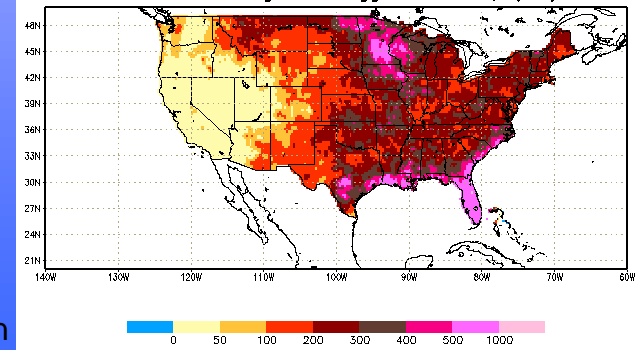


Jun 2002 - Aug 2002 NEXRAD Total Pcp (MM)



**Accumulated  
Precipitation,  
JJA 2002**

Jun 2002 - Aug 2002 Higgins Total Pcp (MM)



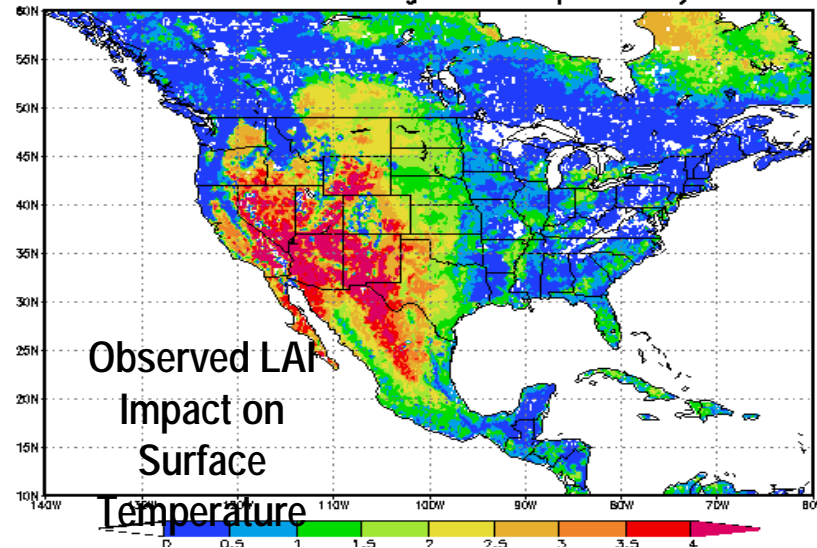
Gottschalck, J., J. Meng, M. Rodell, and P. Houser, Analysis of multiple precipitation products and preliminary assessment of their impact on Global Land Data Assimilation System (GLDAS) land surface states, J. Hydromet., in press, 2005.



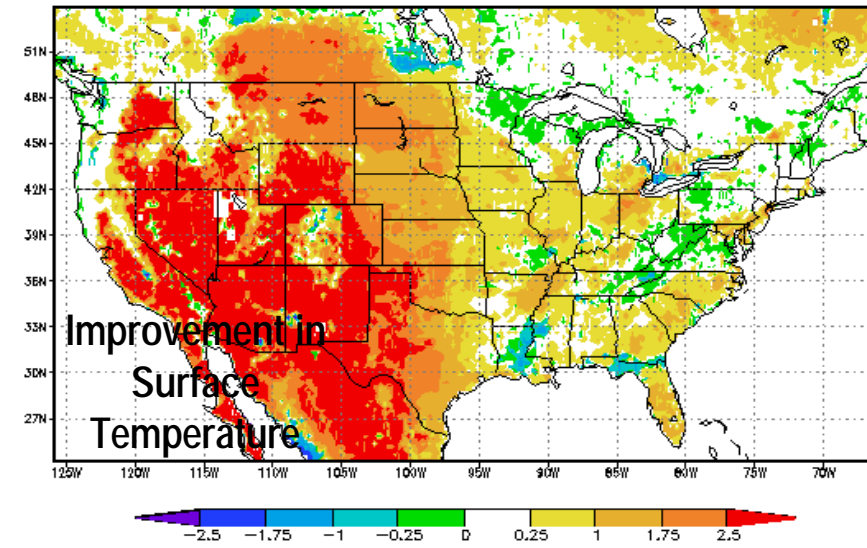
# Parameterization: Leaf Area Index



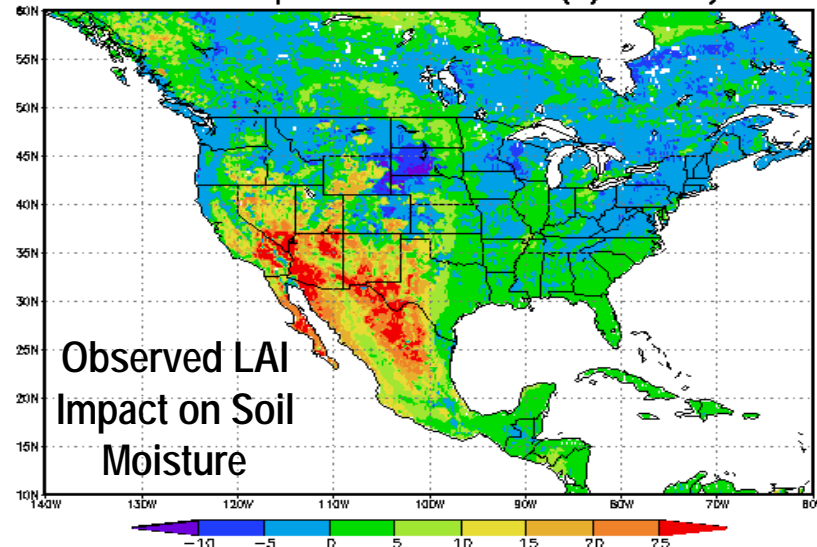
AVHRR-INDEX -- Average Sfc Temp -- July 2001



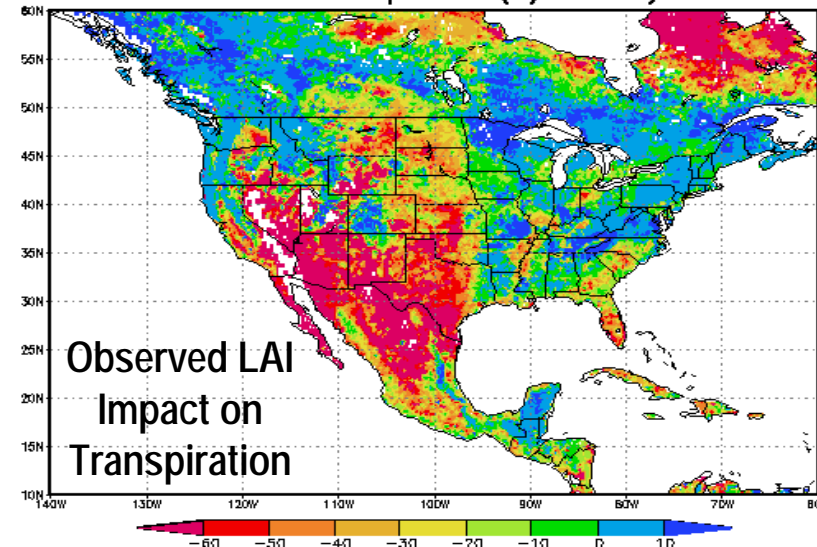
|GOES-INDEX| - |GOES-AVHRR| -- Avg Sfc Temp -- July 2001



AVHRR-INDEX Top 1 m Soil Moisture (%) -- July 2001



AVHRR-INDEX Transpiration (%) -- July 2001



Gottschalck, J., M. Rodell, P. Houser, U. Jambor, J. Meng, K. Arsenault, and B. Cosgrove, Impact of remotely sensed leaf area index as part of the Global Land Data Assimilation System, J. Hydromet., submitted, 2005.

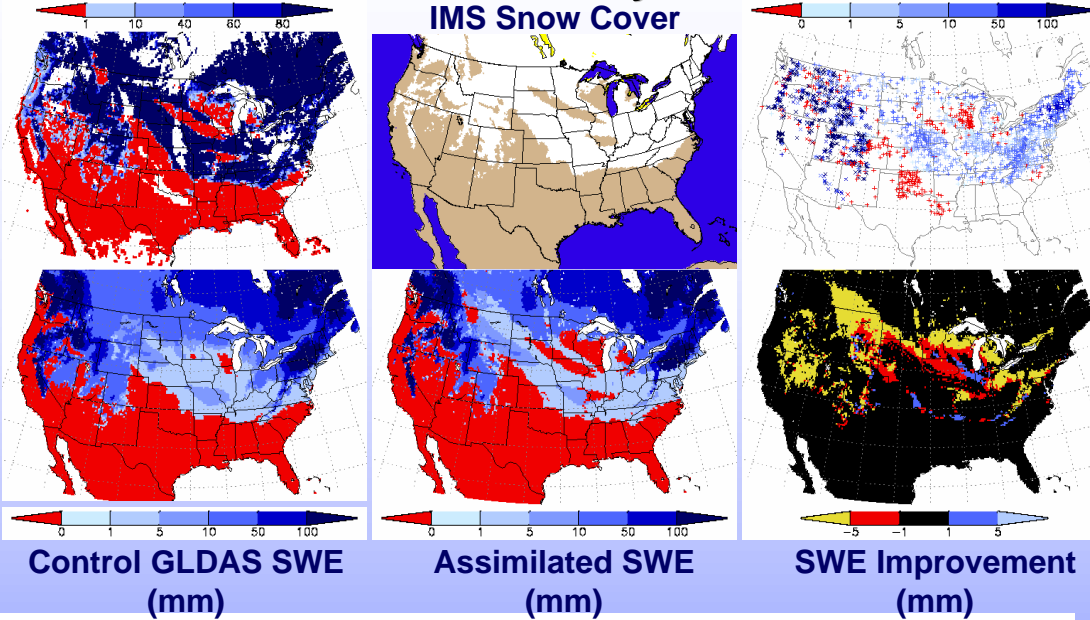


# Data Assimilation: Snow

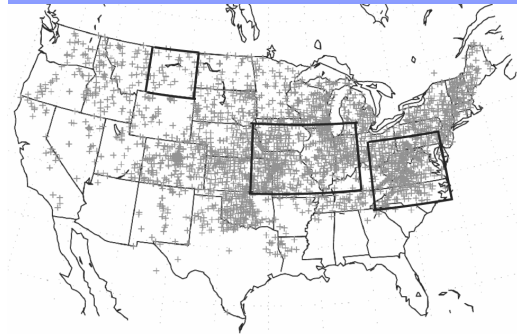
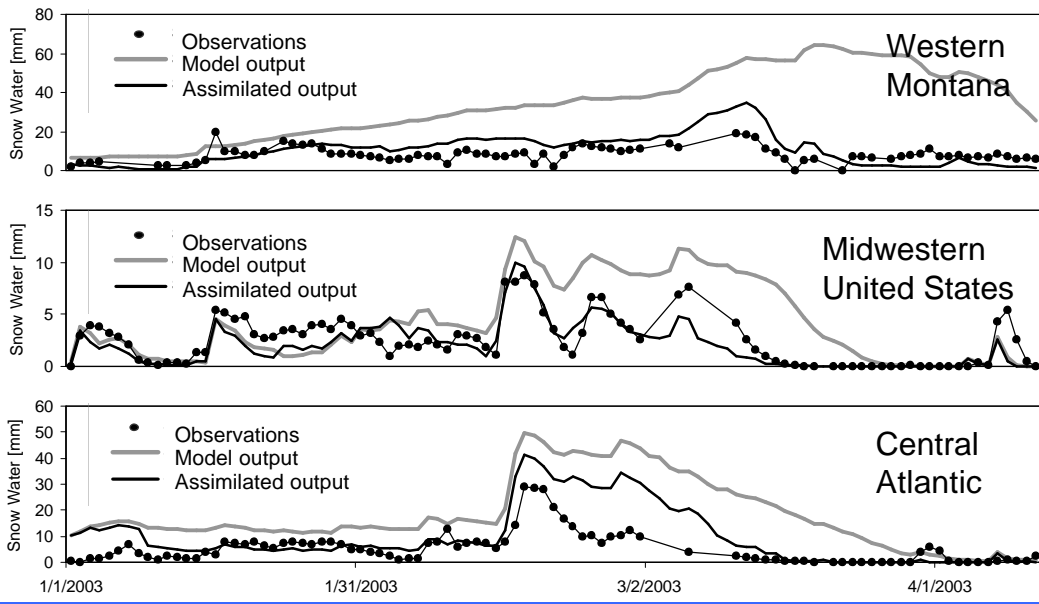


MODIS Snow Cover 21Z 17 January 2003

Observed SWE



- MODIS snow cover fields used to update GLDAS simulations
- Models fill spatial and temporal gaps in data
- Assimilated output agrees more closely with independently derived snow fields (top left) and time series (bottom left)
- Assimilated output contains more information (snow water equivalent) than MODIS (snow cover) alone



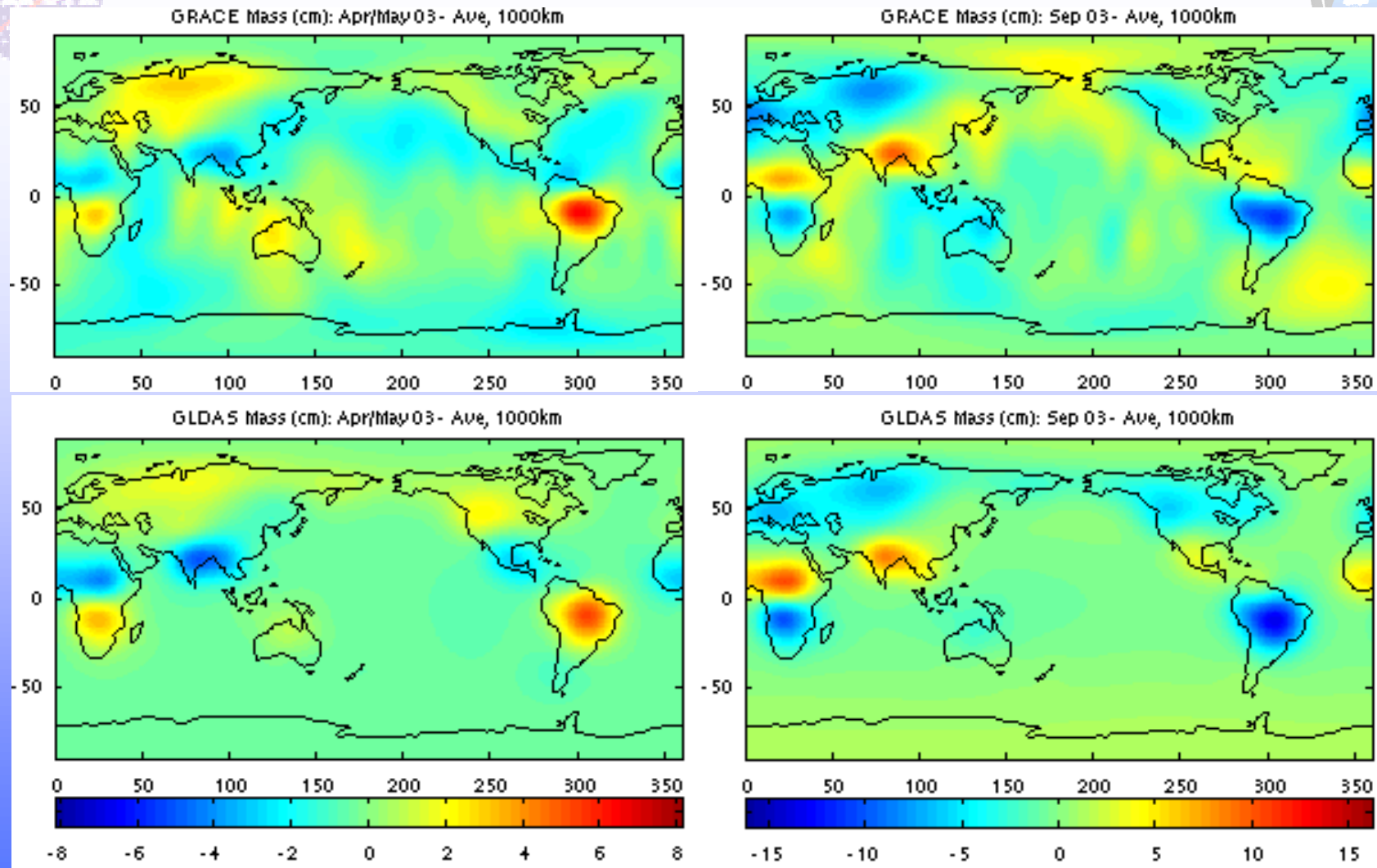
Locations of averaging regions and Cooperative Network snow observation sites

Rodell, M., and P. R. Houser, Updating a land surface model with MODIS derived snow cover, J. Hydromet., 5 (6), 1064-1075, 2004.





# Output Evaluation: Global Observations



Terrestrial water storage from GRACE (top), and 2m column soil moisture plus snow water equivalent from Noah (bottom), April/May (left) and September (right), 2003 (1000 km smoothing)



# Sensitivity of Land Surface Simulations to Model Physics, Parameters, and Forcing



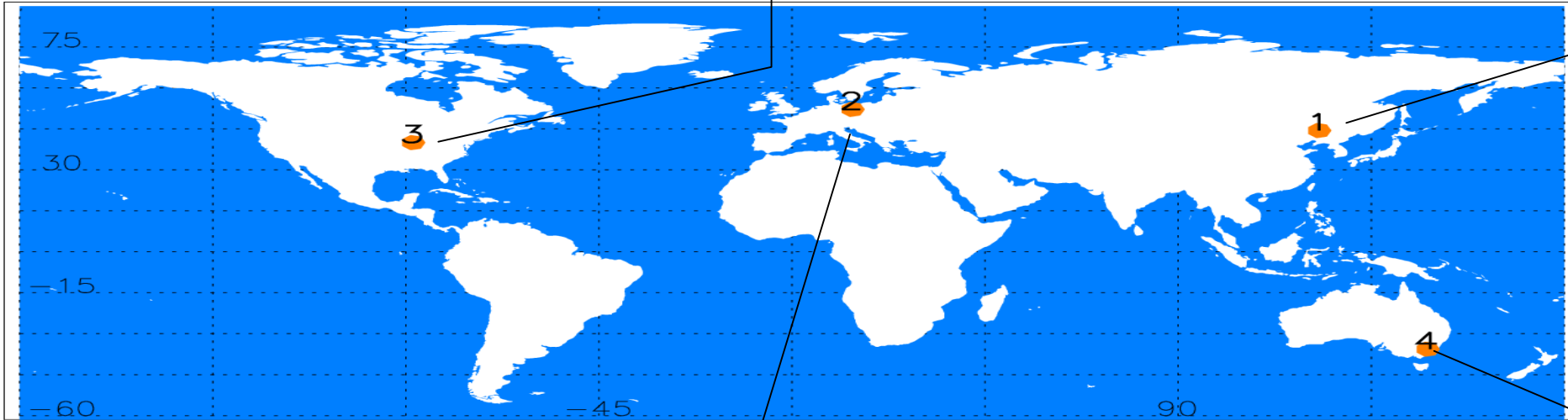
- CEOP site characteristics and met data are control inputs
- CEOP surface observations used for evaluation
- What are the impacts and relative importance of inputs:
  - Parameters: elevation, soil, land cover,
  - Forcing: precipitation, radiation,
  - Land surface models: Noah 2.7.1, CLM2, Mosaic;
- to outputs:
  - Evapotranspiration (ET),
  - Sensible heat flux (Qh),
  - Soil moisture (SM)?
- Is reality within the expected range of possible outcomes from a reasonable set of configurations?

Kato, H., M. Rodell, F. Beyrich, H. Cleugh, E. van Gorsel, H. Liu, and T. P. Meyers, Sensitivity of Land Surface Simulations to Model Physics, Parameters, and Forcings, at Four CEOP Sites, J. Meteor. Soc. Japan, submitted, 2006.



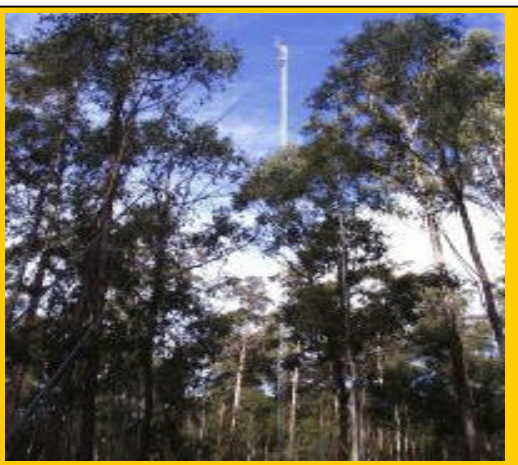
**Bondville**  
 (40° 0'22.356"N,  
 88° 17'25.476"W)

**Tongyu**  
 (44°25'N,  
 122°52'E)



**Lindenberg**  
 (52° 10'01" N,  
 14° 07'27" E)

**Tumberumba**  
 (35°39'20.6"S,  
 148° 09'07.5"E)





# GLDAS/CEOP Sensitivity Study Inputs



- Precipitation: Observations, disaggregated CMAP, and GDAS
- Radiation: Observations, AGRMET, and GDAS
- Elevation, Land cover, Soils:

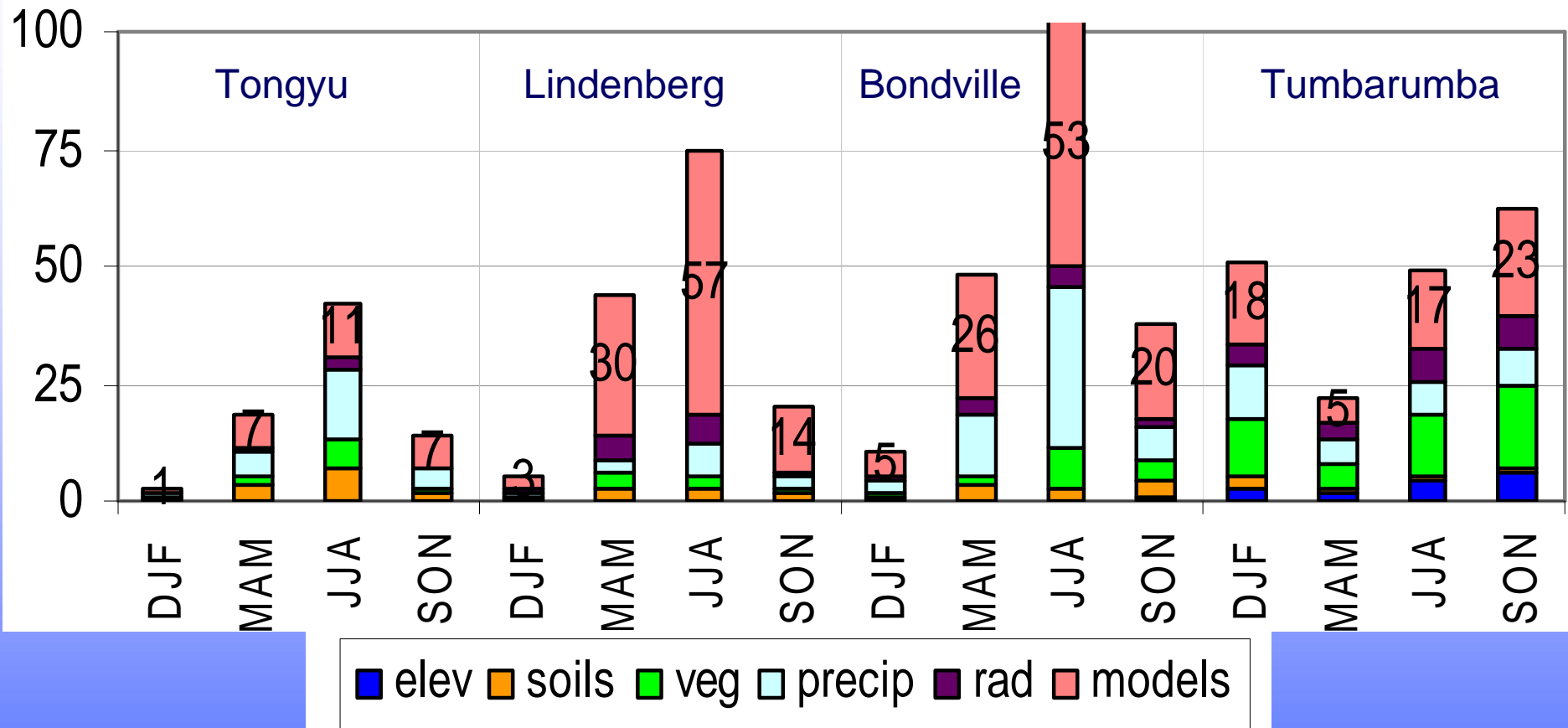
Site Name	Elev.	Land cover	Sand	Clay	Zobler	USDA
Lindenberg	73 68	Grassland <i>Cropland</i>	74 48	26 20	Coarse-med-fine <i>organic</i>	sandy clay loam <i>loam</i>
Tongyu- Cropland	184 146	Cropland <i>Woody Grassland</i>	60 38	35 32	Coarse-med-fine <i>medium-fine</i>	sandy clay <i>clay loam</i>
Bondville	216 213	Cropland <i>(Grassland)</i>	8 34	27 25	organic <i>organic</i>	silty loam/silt <i>loam</i>
Tumbarumba	1200 914	Evergreen Broadleaf forest <i>Cropland*</i>	33.5 59	32.5 23	Medium-fine <i>Coarse-med-fine</i>	clay loam <i>sandy clay loam</i>

Model parameters based on station observations (control; normal font) and the *GLDAS standard (experimental; italics)*.

- Used GLDAS standard data for other parameters (soil color, slope, porosity, albedo, greenness, LAI, SAI, etc.)



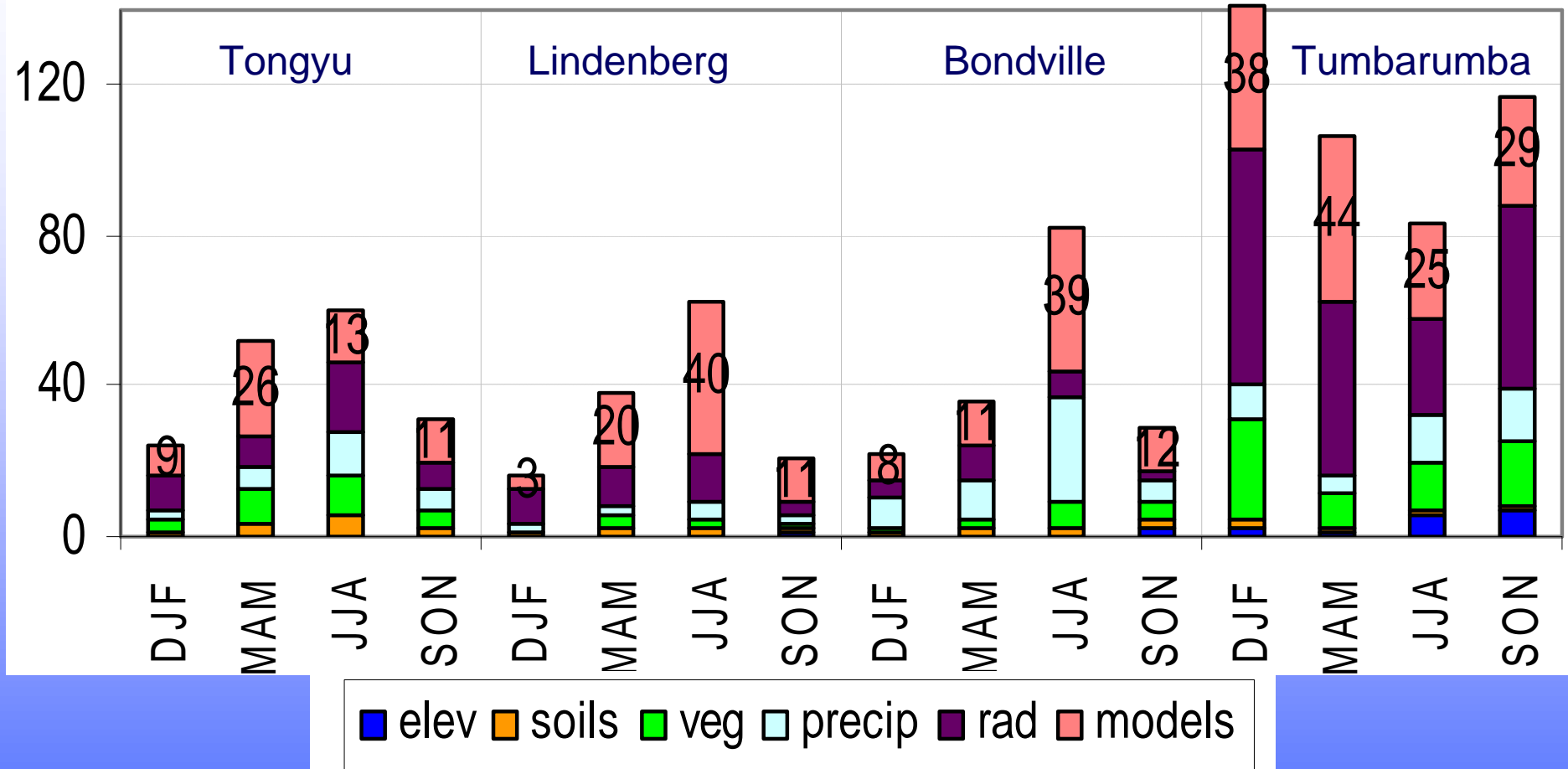
# Sensitivity of Evapotranspiration by Season



Evapotranspiration (mm/month) most sensitive to LSM, followed by precipitation, then land cover and radiation



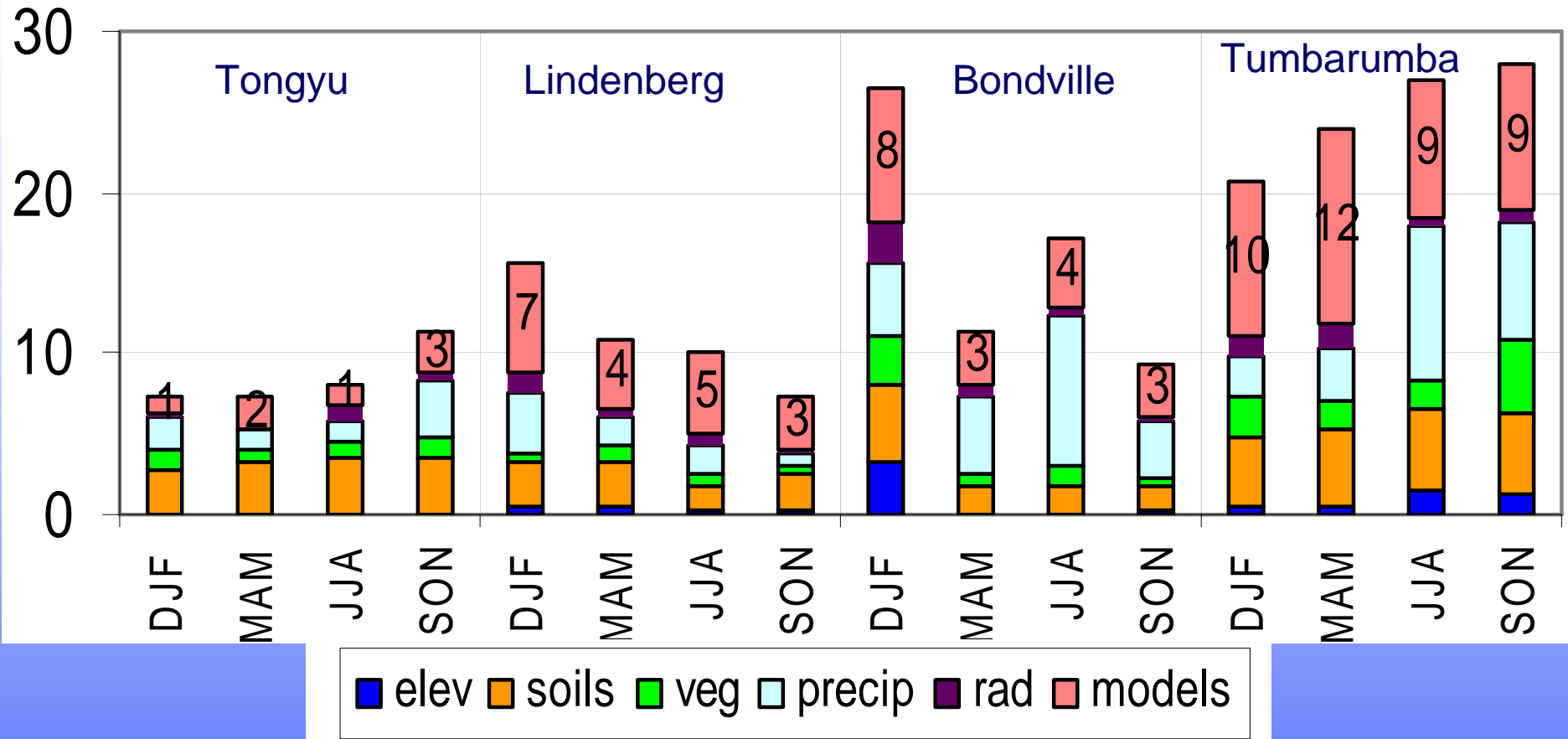
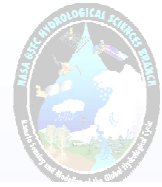
# Sensitivity of Sensible Heat Flux by Season



Sensible heat flux ( $\text{W/m}^2$ ) most sensitive to LSM, followed by radiation, then precipitation and land cover



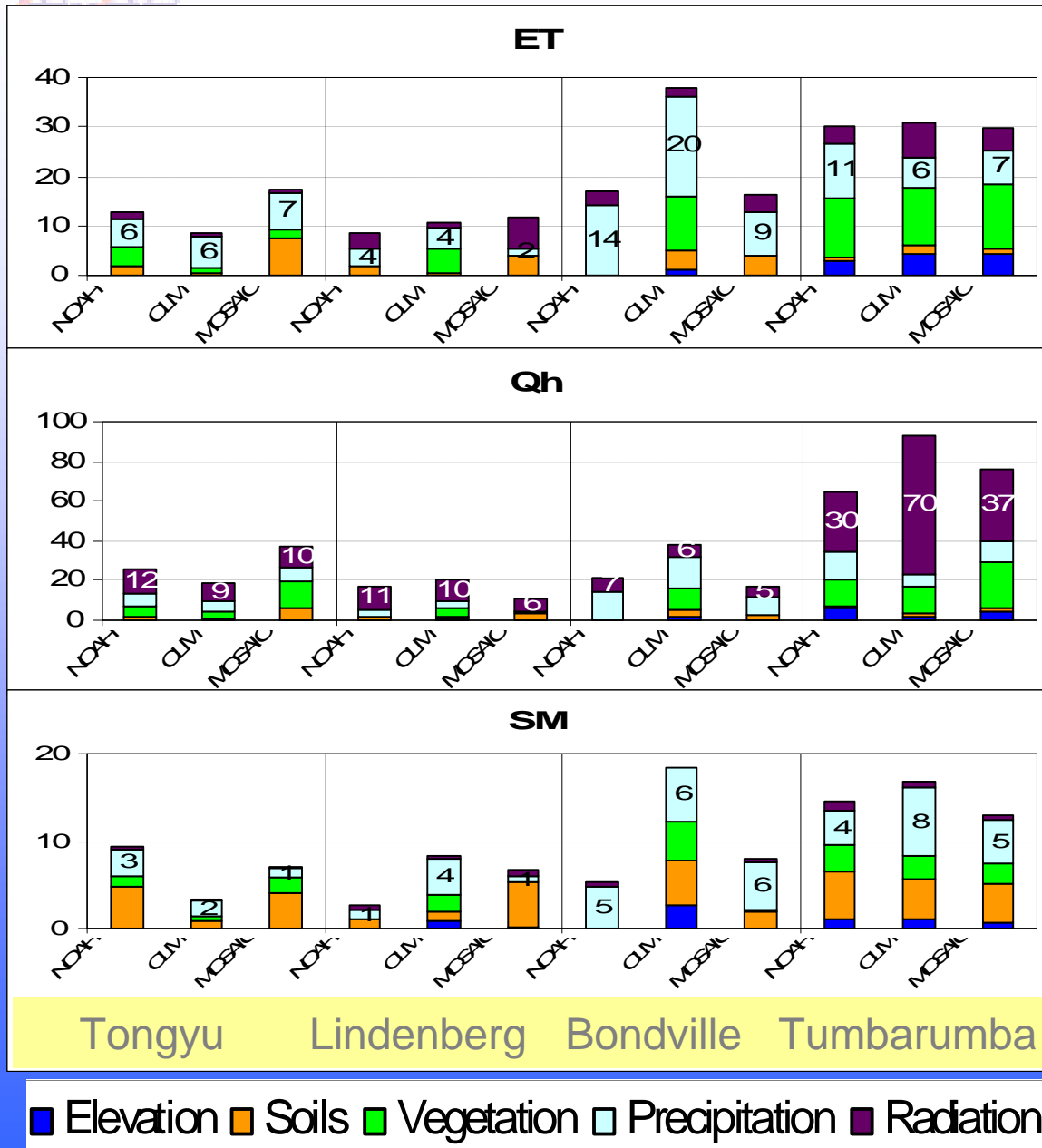
# Sensitivity of Soil Moisture by Season



Top layer soil moisture (% volumetric) most sensitive to LSM, followed by precipitation, then soils and land cover



# Sensitivity by Land Surface Model

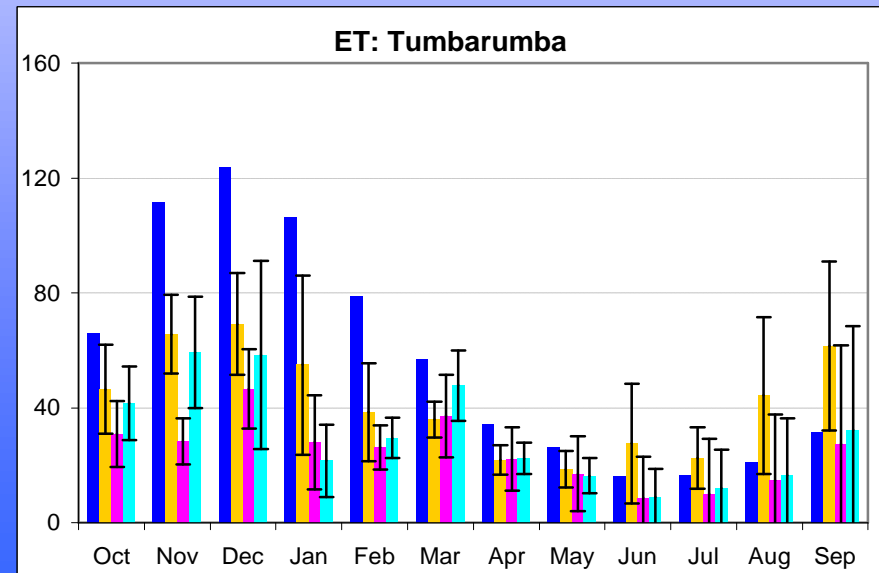
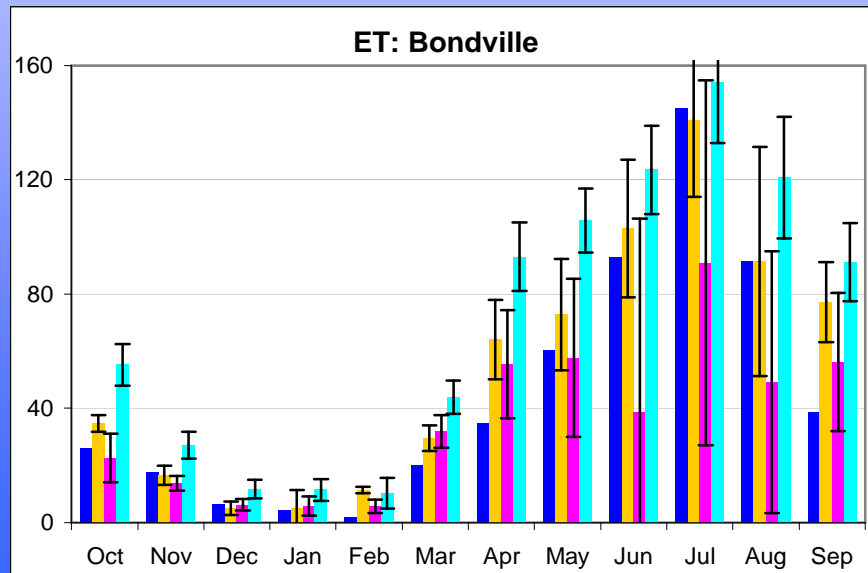
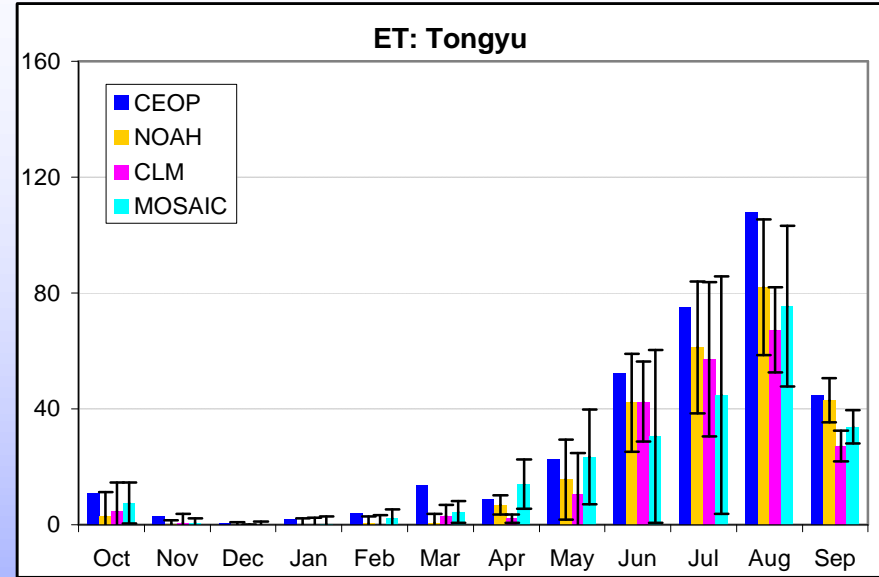
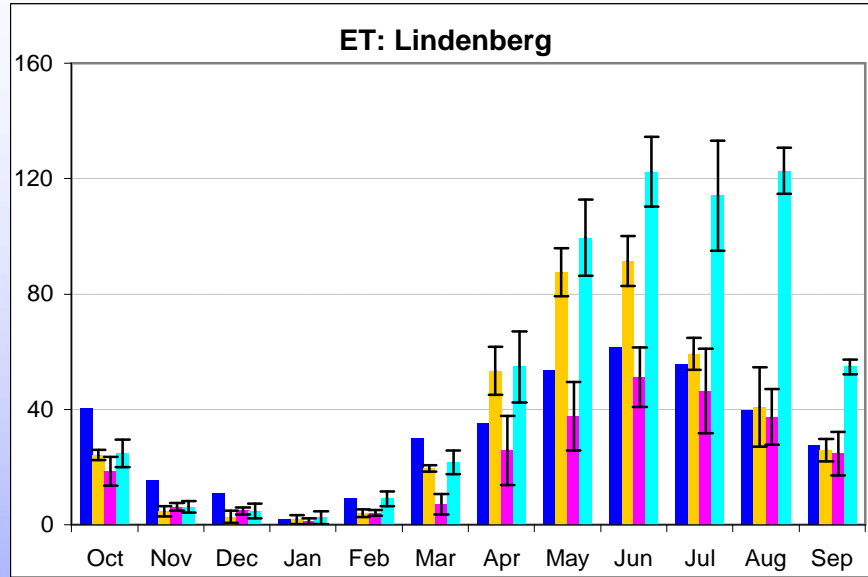


- Noah: Typical sensitivities. Land cover change between grassland and cropland has no effect. Soil type did not change at Bondville.
- CLM: Sensitive to change between grassland cropland. More sensitive to elevation than other models.
- Mosaic: More sensitive to soils than other models. Radiation more important than precipitation at Lindenberg.



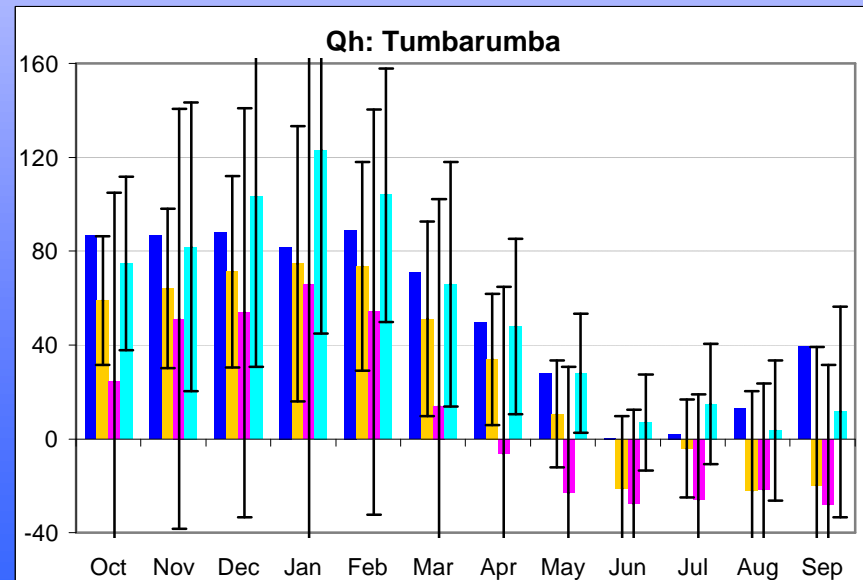
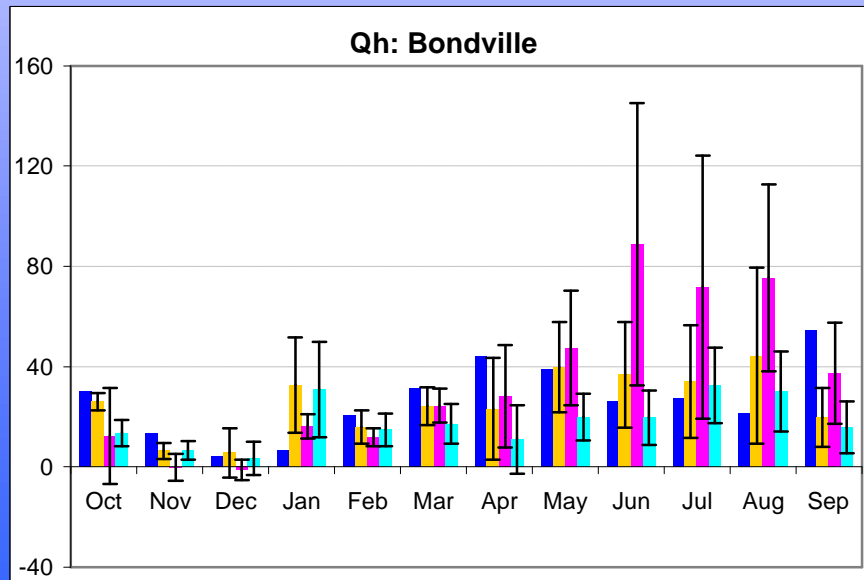
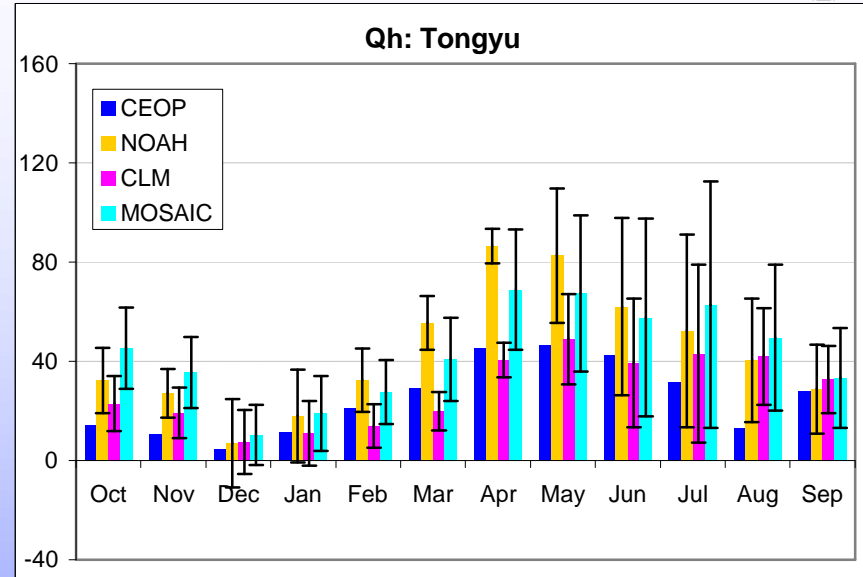
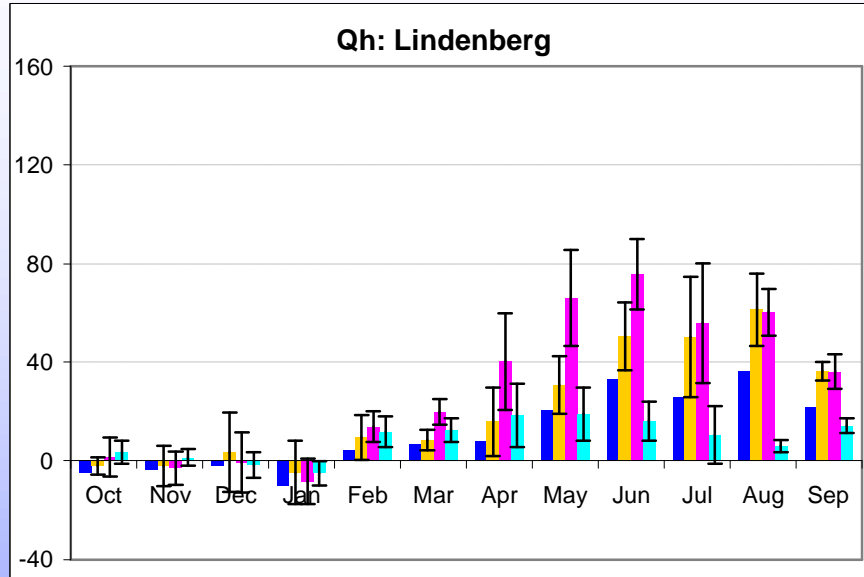


# Range of Expected Outputs, ET (mm/month)



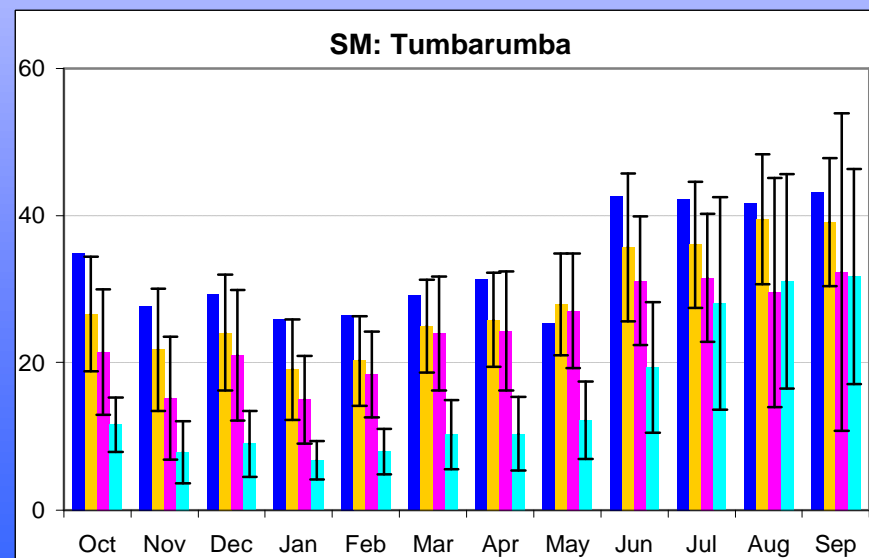
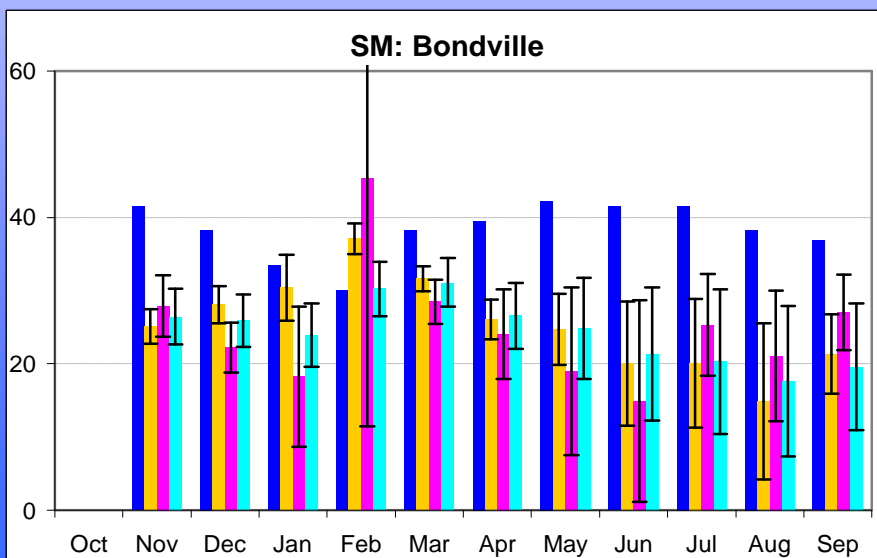
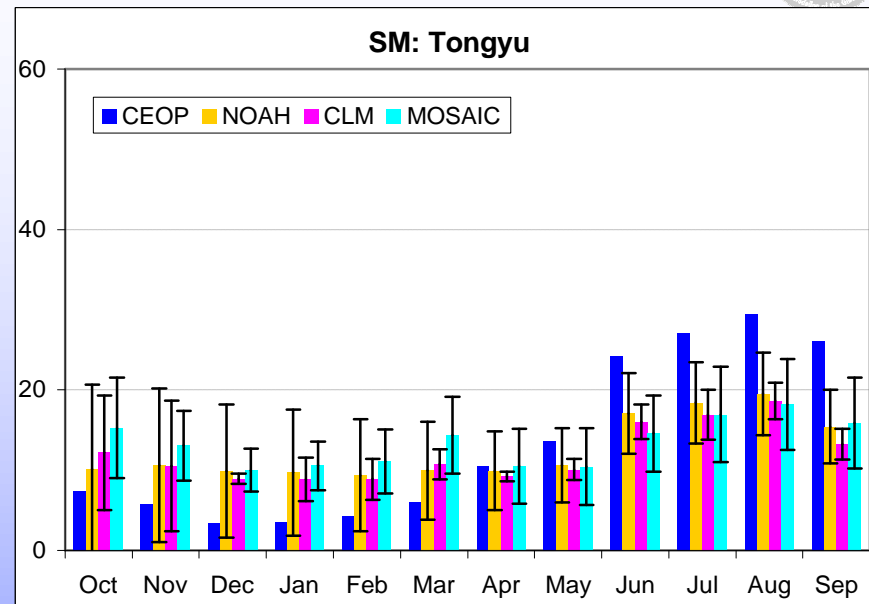
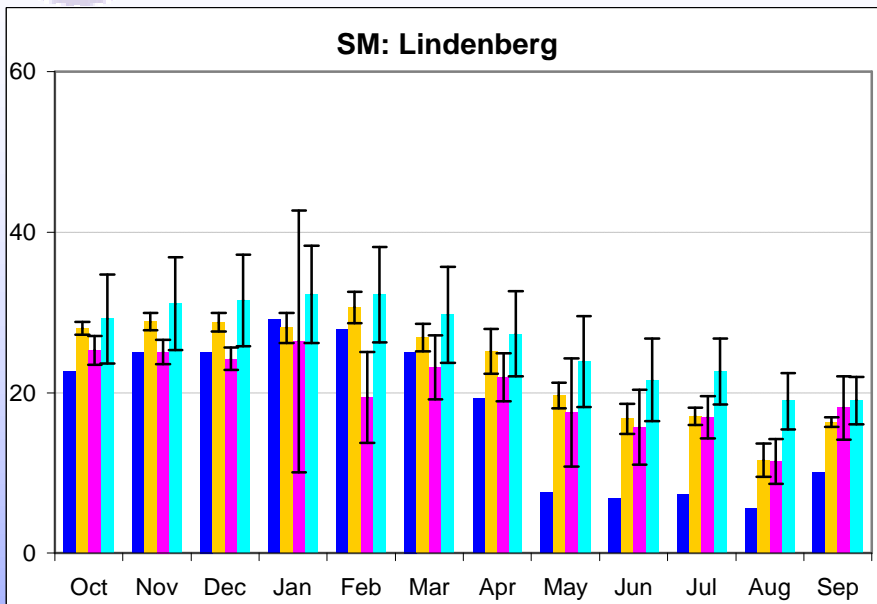


# Range of Expected Outputs, Qh (W/m<sup>2</sup>)





# Range of Expected Outputs, SM (% volumetric)





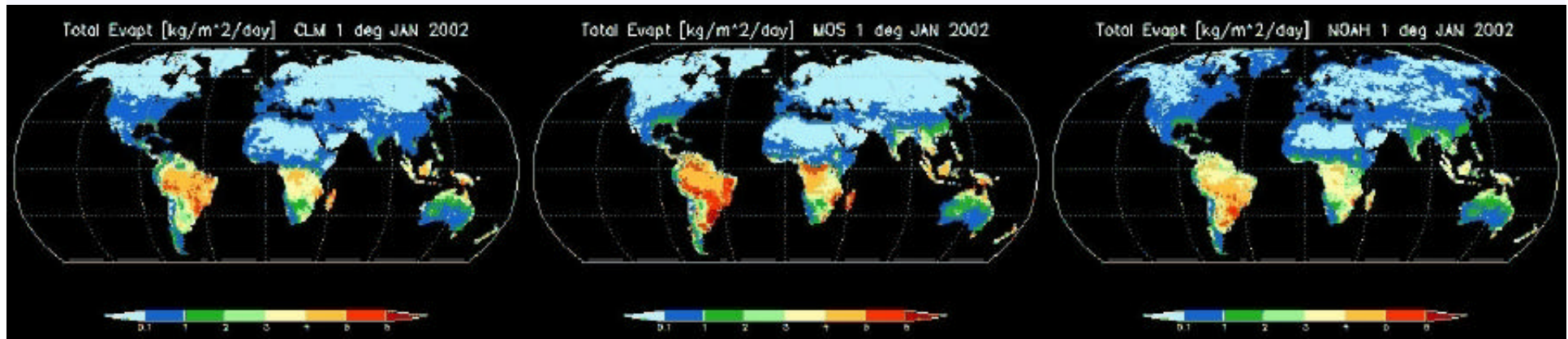
# GLDAS/CEOP Sensitivity Study: Discussion



- **Output ET, Qh, and SM most sensitive to choice of LSM (Noah, CLM, Mosaic) despite identical forcing and parameters**
  - ET very sensitive to precip, followed by land cover and radiation
  - Qh very sensitive to radiation, followed by precip and land cover
  - SM very sensitive to precip, followed by soils and land cover
  - Water vs. energy limited shifts sensitivity b/t precip and rad
  - Larger uncertainty in forcing during wet season, which leads to larger range of outputs
  - **Potential for achieving accurate simulation of reality (*in situ* data) by adjusting/refining inputs alone is fair to poor**
- ∴ Continued improvement and calibration of LSMs is essential



# GLDAS Output



Monthly mean evapotranspiration, 2002-04, from simulations with CLM2, Mosaic, and Noah 2.7.1 LSMs. [Color bars range from 0.1 to 8 mm/day]

- 0.25 ° and 1 ° gridded, global, 1979-present simulations with 3 LSMs: CLM2, Mosaic, and Noah 2.7.1 (contact [Matthew.Rodell@nasa.gov](mailto:Matthew.Rodell@nasa.gov))
- CEOP MOLTS (3 models, EOP1-4) available from UCAR
- We advise against using old GLDAS/Mosaic 0.25 ° MOLTS



# Sensitivity by Season



ET

ET	Site	Elevation	Soils	Land cover	Precipitation	Radiation	Models		
ET	DJF	Tongyu	0.01	0.37	0.06	1.48	0.06	0.95	
		Lindenberg	0.02	0.58	0.04	1.03	1.15	2.52	
		Bondville	0.23	1.08	0.19	3.23	0.67	4.79	
		Tumbarumba	2.97	2.27	12.73	11.15	4.10	17.78	
	MAM	Tongyu	0.04	3.51	1.36	5.56	0.52	7.31	
		Lindenberg	0.17	2.46	3.19	2.61	5.24	30.21	
		Bondville	0.23	2.93	2.47	12.56	4.05	26.07	
	JJA	Tumbarumba	1.59	1.11	5.13	5.47	3.33	5.36	
		Tongyu	0.13	7.06	5.93	15.25	2.74	10.79	
		Lindenberg	0.15	2.83	2.29	6.57	6.33	56.51	
		Bondville	0.11	2.94	8.02	34.60	4.03	53.16	
	SON	Tumbarumba	4.57	0.38	13.44	7.36	6.40	16.83	
Tongyu		0.08	1.50	1.27	3.98	0.49	6.67		
Lindenberg		0.16	1.22	1.40	2.12	1.36	14.07		
Bondville		1.01	3.26	4.07	7.46	1.63	20.23		
Qh	Qh	Tumbarumba	5.98	1.08	17.59	7.68	6.75	22.90	
		Site	Elevation	Soils	Land cover	Precipitation	Radiation	Models	
		DJF	Tongyu	0.21	0.66	3.28	3.02	8.75	8.63
			Lindenberg	0.17	1.00	0.04	2.60	8.85	3.32
	Bondville		0.43	1.06	0.47	8.44	4.15	7.98	
	Tumbarumba		2.24	1.96	26.81	9.27	62.96	37.82	
	MAM	Tongyu	0.12	3.48	9.63	4.77	8.34	25.79	
		Lindenberg	0.32	2.39	3.07	2.42	10.55	19.88	
		Bondville	0.20	2.45	2.38	10.28	9.45	10.89	
		Tumbarumba	1.26	1.06	9.19	4.97	46.44	44.01	
	JJA	Tongyu	0.14	5.33	10.31	11.96	18.82	13.25	
		Lindenberg	0.21	2.05	1.83	5.13	12.89	40.34	
Bondville		0.07	2.38	6.47	27.72	7.03	38.80		
Tumbarumba		6.21	0.45	12.85	13.27	25.22	25.16		
SON	Tongyu	0.17	1.69	5.46	5.79	6.68	11.30		
	Lindenberg	0.93	1.17	1.29	2.13	4.08	10.69		
	Bondville	1.85	3.11	4.35	5.94	2.36	11.65		
	Tumbarumba	7.06	1.08	17.42	14.15	48.03	29.32		
SM	SM	Tumbarumba	7.06	1.08	17.42	14.15	48.03	29.32	
		Site	Elevation	Soils	Land cover	Precipitation	Radiation	Models	
		DJF	Tongyu	0.01	2.84	1.08	2.11	0.13	1.25
			Lindenberg	0.57	2.83	0.40	3.67	1.27	6.81
	Bondville		3.26	4.70	3.24	4.55	2.40	8.23	
	Tumbarumba		0.50	4.25	2.66	2.33	1.25	9.76	
	MAM	Tongyu	0.02	3.16	0.91	1.14	0.11	1.98	
		Lindenberg	0.57	2.62	1.06	1.75	0.58	4.29	
		Bondville	0.09	1.71	0.64	4.88	0.75	3.22	
		Tumbarumba	0.52	4.73	1.84	3.14	1.70	11.92	
	JJA	Tongyu	0.04	3.49	1.04	1.34	0.81	1.34	
		Lindenberg	0.13	1.74	0.76	1.61	0.78	5.03	
Bondville		0.01	1.64	1.40	9.24	0.54	4.42		
Tumbarumba		1.48	5.13	1.71	9.45	0.61	8.71		
SON	Tongyu	0.05	3.43	1.40	3.53	0.30	2.65		
	Lindenberg	0.16	2.31	0.59	0.79	0.29	3.16		
	Bondville	0.15	1.67	0.55	3.34	0.38	3.32		
	Tumbarumba	1.32	5.07	4.50	7.27	0.86	8.94		

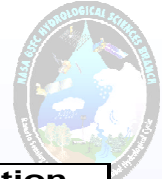
Qh

SM

low    low-mid    mid-low    mid    mid-high    high



# Sensitivity by Land Surface Model



ET

ET	Model	Elevation	Soils	Land cover	Precipitation	Radiation
Tongyu	NOAH	0.06	1.76	3.67	5.87	1.31
	CLM	0.04	0.34	0.94	6.45	0.80
	MOSAIC	0.09	7.23	1.86	7.38	0.74
Lindenberg	NOAH	0.11	1.50	0	3.71	3.09
	CLM	0.18	0.14	5.17	3.97	1.26
	MOSAIC	0.09	3.68	0.03	1.57	6.22
Bondville	NOAH	0.02	0	0	14.19	2.63
	CLM	1.11	3.89	11.00	20.22	1.57
	MOSAIC	0.05	3.76	0.07	8.99	3.58
Tumbarumba	NOAH	2.87	0.61	11.98	11.20	3.58
	CLM	4.31	1.71	11.82	5.82	7.10
	MOSAIC	4.15	1.31	12.86	6.72	4.75
Qh	Model	Elevation	Soils	Land cover	Precipitation	Radiation
Tongyu	NOAH	0.14	1.68	4.87	6.50	12.22
	CLM	0.18	0.69	3.65	5.15	9.30
	MOSAIC	0.15	6.00	12.98	7.50	10.43
Lindenberg	NOAH	0.12	1.43	0	3.88	11.13
	CLM	1.01	0.43	4.65	3.76	10.33
	MOSAIC	0.10	3.10	0.02	1.57	5.82
Bondville	NOAH	0.07	0	0	14.01	7.10
	CLM	1.82	3.92	10.19	16.32	5.60
	MOSAIC	0.03	2.84	0.06	8.95	4.54
Tumbarumba	NOAH	6.24	0.74	12.96	14.71	29.93
	CLM	1.66	1.55	13.17	6.21	70.41
	MOSAIC	4.69	1.12	23.58	10.31	36.64
SM	Model	Elevation	Soils	Land cover	Precipitation	Radiation
Tongyu	NOAH	0.03	4.69	1.28	3.02	0.32
	CLM	0.02	0.93	0.40	1.92	0.38
	MOSAIC	0.04	4.07	1.65	1.17	0.32
Lindenberg	NOAH	0.04	1.01	0	1.03	0.37
	CLM	0.83	1.04	2.09	4.06	1.16
	MOSAIC	0.20	5.08	0.01	0.77	0.66
Bondville	NOAH	0.04	0	0	4.80	0.53
	CLM	2.57	5.27	4.33	6.15	1.84
	MOSAIC	0.02	2.01	0.04	5.55	0.68
Tumbarumba	NOAH	1.04	5.47	3.09	3.91	0.73
	CLM	1.06	4.58	2.67	7.79	1.97
	MOSAIC	0.78	4.34	2.28	4.94	0.62

Qh

SM