

Global estimates of evapotranspiration for
climate studies using multi-sensor remote
sensing data: Evaluation of three process-
based approaches

Vinukollu, R.K., Wood, E.F., Ferguson,
C.R., Fisher, J.B.: *Remote sensing of
the Environment*, 2011

Models

- Surface Energy balance System (SEBS)
 - *Su, 2002*
- Penman-Monteith Algorithm
 - *Mu et al., 2007*
- Priestley-Taylor Algorithm
 - *Fisher et al., 2008*

SEBS

- Partitions the available energy between the turbulent heat fluxes

$$LE = R_{\text{net}} - G - H$$

PM-Mu Algorithm

Canopy Evaporation

$$\lambda E_{can} = \frac{sA_c + \frac{\rho C_p (e_{sat} - e)}{R_a}}{s + \gamma \left(1 + \frac{R_s}{R_a}\right)}$$

$$Rs = \frac{1}{C_c} = (C_s \cdot LAI)^{-1}$$

$$C_s = c_L \cdot m(T_{min}) \cdot m(VPD)$$

m = multiplier that limits potential stomatal conductance by min T_{air} and when VPD is high

Soil Evaporation

$$\lambda E_{soil} = \lambda E_{soil_Pot} \left(\frac{RH}{100} \right)^{\frac{e_{sat} - e}{100}}$$

$$\lambda E_{soil_Pot} = \frac{sA_{soil} + \frac{\rho C_p (e_{sat} - e)}{R_a}}{s + \gamma \frac{R_{tot}}{R_a}}$$

Priestley-Taylor

$$LE = \alpha \frac{\Delta}{\Delta + \gamma} (R_{\text{net}} - G_{\text{flux}})$$

Fisher et al. (2008) developed a model introducing ecophysiological constraint functions (f-functions, unitless multipliers, (0–1) based on atmospheric moisture (VPD and RH) and vegetation indices (normalized and soil adjusted vegetation indices -NDVI and SAVI).

The driving equations in their model are:

$$LE = LE_s + LE_c + LE_i$$

$$LE_c = (1 - f_{\text{wet}}) f_g f_T f_M \alpha \frac{\Delta}{\Delta + \gamma} R_{\text{nc}}$$

$$LE_s = (f_{\text{wet}} + f_{\text{SM}}(1 - f_{\text{wet}})) \alpha \frac{\Delta}{\Delta + \gamma} (R_{\text{ns}} - G)$$

$$LE_i = f_{\text{wet}} \alpha \frac{\Delta}{\Delta + \gamma} R_{\text{nc}}$$

Assumptions

- None of the models incorporate soil moisture
- Ignored evaporation from blowing snow
- No transpiration over snow covered regions
- Canopy interception losses of precipitation

Datasets

- LST/Emissivity (T1) – AIRS/MODIS
- Albedo (T2) – MODIS (averaged BSA and WSA)
- Radiation (T1)

$$R_{\text{net}} = (1 - \alpha_{\text{MODIS}}) \cdot SW_{\downarrow\text{CERES}} + LW_{\downarrow\text{CERES}} - (\epsilon_{\text{MODIS}} \cdot \sigma \cdot LST_{\text{AIRS}}^4)$$

- Surface meteorology (T1) - AIRS
- Surface/vegetation characteristics (T2) - MODIS
- Other – MODIS snow cover product, Surface Radiation Budget dataset (for converting instantaneous to daily values, etc)

Type 1 – subdiurnal variation

Type 2 – no subdiurnal variation

Methodology

- Data are used with the three process models to estimate the instantaneous latent heat fluxes
- All models: LH flux for snow covered regions are estimated using the Penman equation. If the surface temperature is below freezing, assumed that there is no evaporation
- Instantaneous fluxes are converted to daily values by assuming that evaporative fraction is constant throughout the day $EF = \frac{LH}{A}$

Methodology - continued

- The daily ET is then extrapolated using:

$$ET_{daily} = \lambda \cdot n \cdot EF_{inst} (R_{net} - G)_{daytime}$$

λ = latent heat of evaporation;

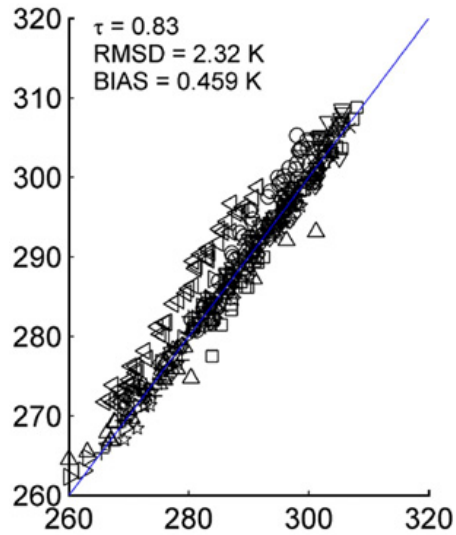
$n = 1.10$ – factor to include nighttime evaporation

- Interception losses are added to the ET estimate, and daily sensible heat flux is calculated from energy balance equation

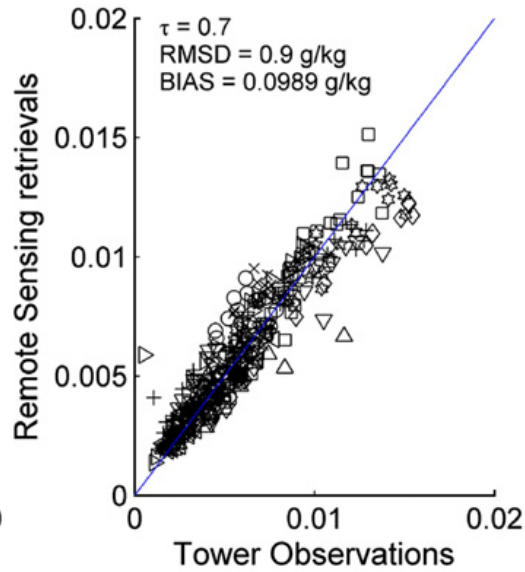
$$H_{daily} = R_{net-daily} - G_{daily} - \lambda ET_{daily}$$

Algorithm and data evaluation: Scatter plots of tower data vs. satellite data (monthly mean)

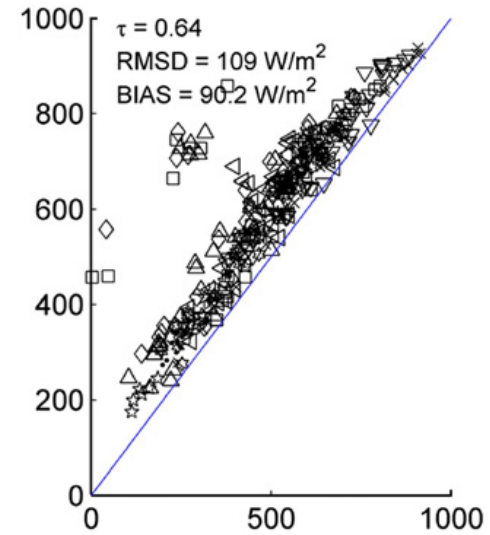
a) Air Temperature (K)



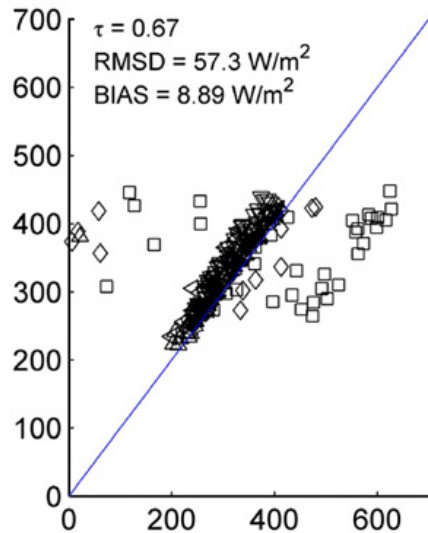
b) Mass Mixing Ratio (kg/kg)



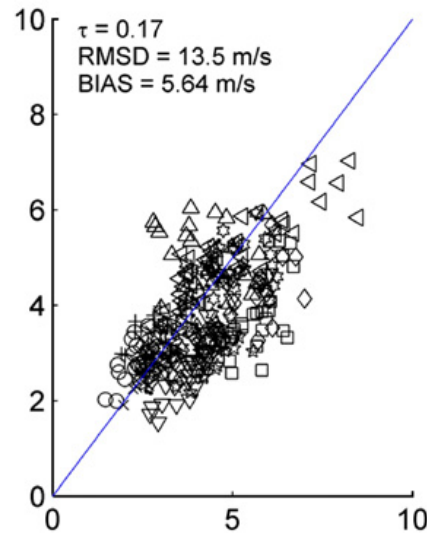
c) Incoming SW Radiation (W/m^2)



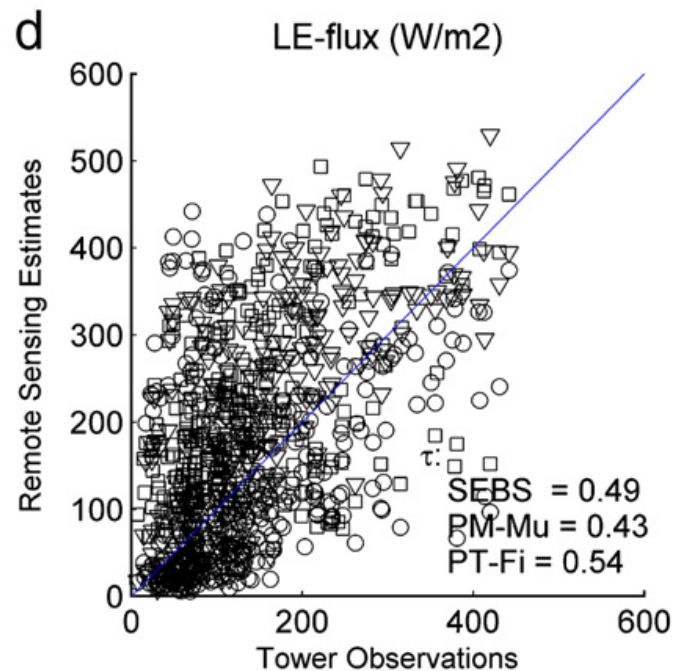
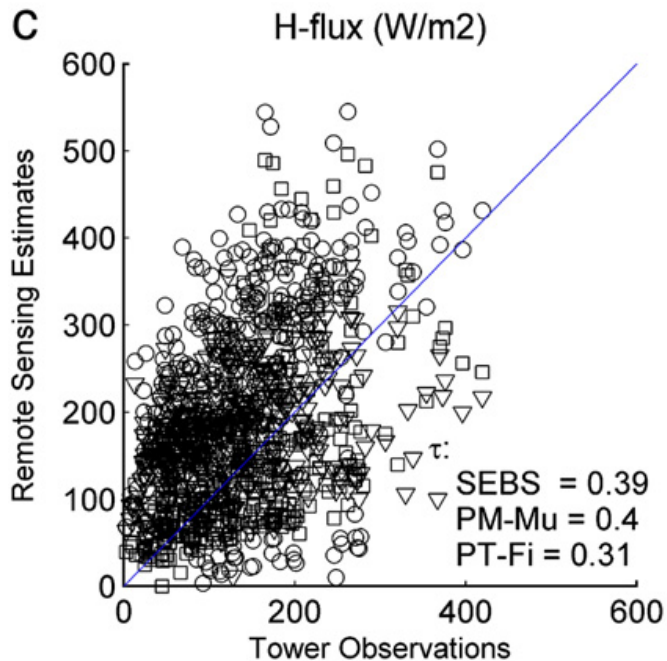
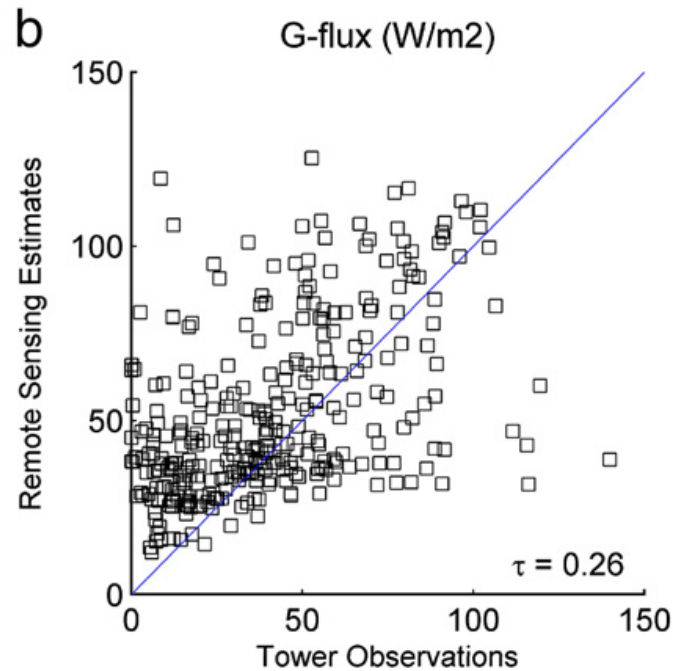
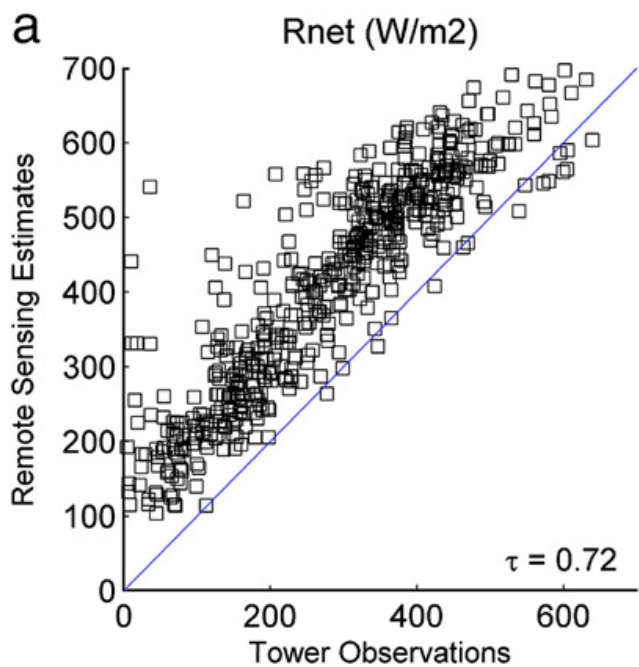
d) Incoming LW Radiation (W/m^2)



e) Wind Speed (m/s)



- ARM
- ▽ AUD
- BLO
- ◇ BON
- △ FPE
- + HAV
- ☆ MEA
- MMF
- △ NIW
- ▽ SYL
- × TON
- ☆ UMBS



□ SEBS ○ PM-Mu ▽ PT-Fi

Monthly mean
remote sensing
estimates :

- (a) net radiation (Rnet);
- (b) soil heat flux (G-flux);
- (c) sensible heat flux (H-flux); and
- (d) latent heat flux (LE-flux), as compared with ground observations from flux towers for years 2003–2006

Possible causes of discrepancy

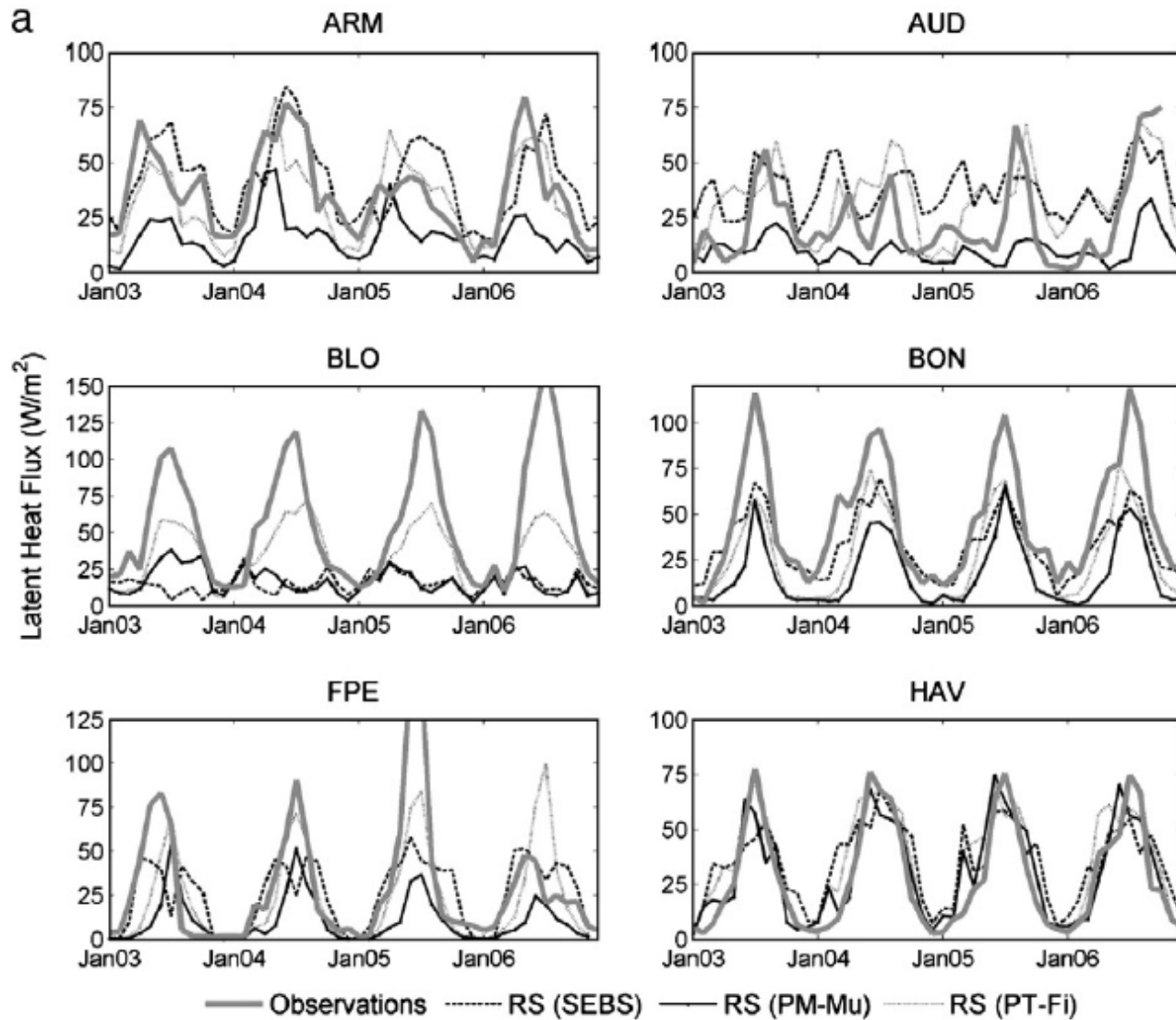
1. Fluxes from remote sensing are instantaneous retrievals, while flux tower data are averaged over 1-hour period
2. Difference in spatial scales between the satellite footprints and the tower footprint + heterogeneity of the surface
3. Lack of energy balance closure for tower data

Energy Balance Closure

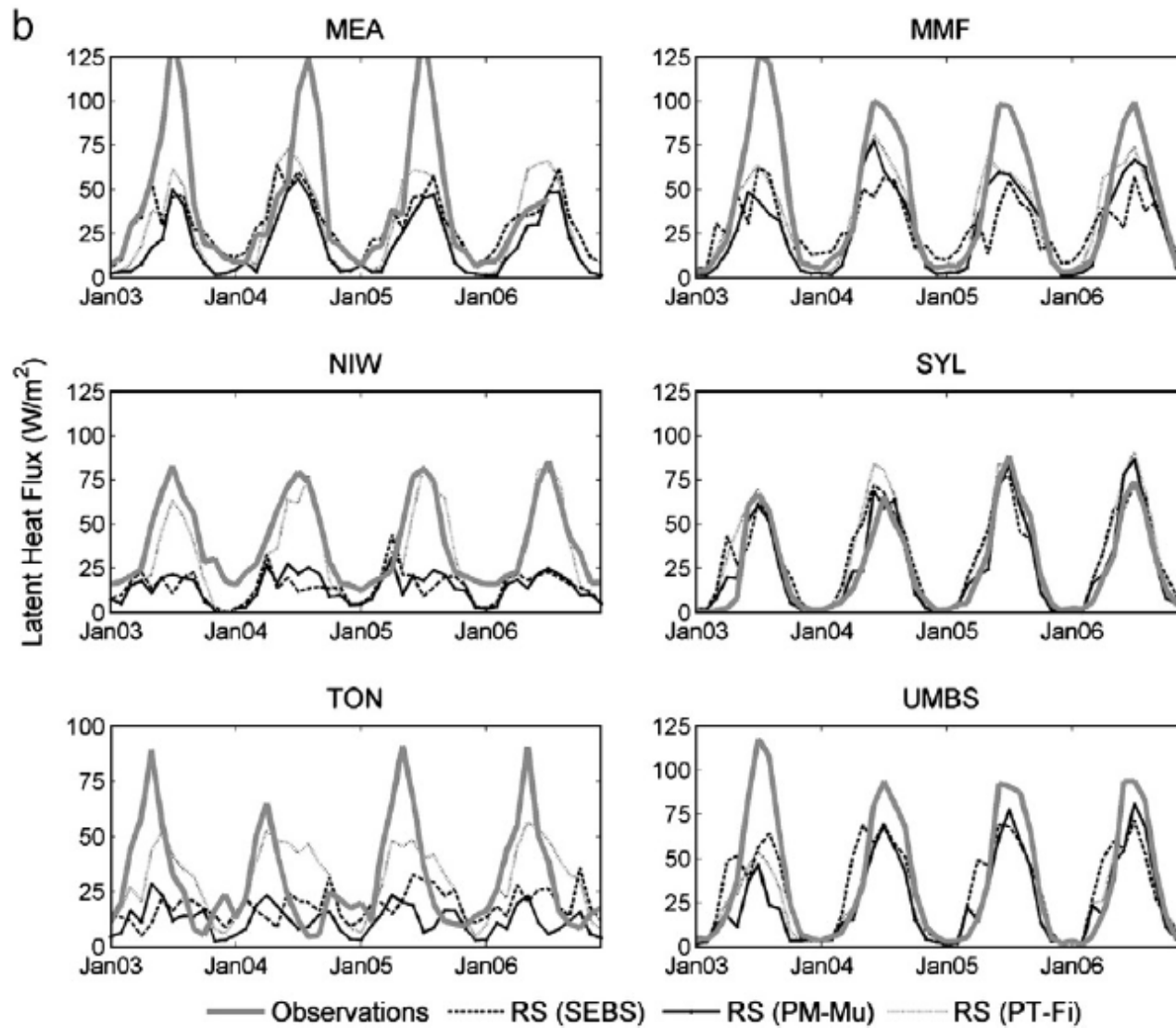
$$\text{Yearly } \frac{SH + LE}{R_{NET} - G}$$

Tower	Elev. (m)	Lat	Lon	Closure
ARM SGP – Main (ARM)	314	36.61	– 97.49	0.68
Audubon (AUD)	1469	31.59	– 110.51	0.70
Blodgett Forest (BLO)	1315	38.90	– 120.63	0.55
Bondville (BON)	219	40.01	– 88.29	0.56
Fort Peck (FPE)	634	48.31	– 105.10	0.64
Harvard (HAV)	340	42.54	– 72.17	NA
Mead – Rainfed (MEA)	363	41.18	– 96.44	0.85
Morgan Monroe (MMF)	275	39.32	– 86.41	0.24
Niwot Ridge (NIW)	3050	40.03	– 105.55	0.80
Sylvania Wilderness (SYL)	540	46.24	– 89.35	0.65
Tonzi (TON)	177	38.43	– 120.97	0.42
UMBS (UMBS)	234	45.56	– 84.71	NA

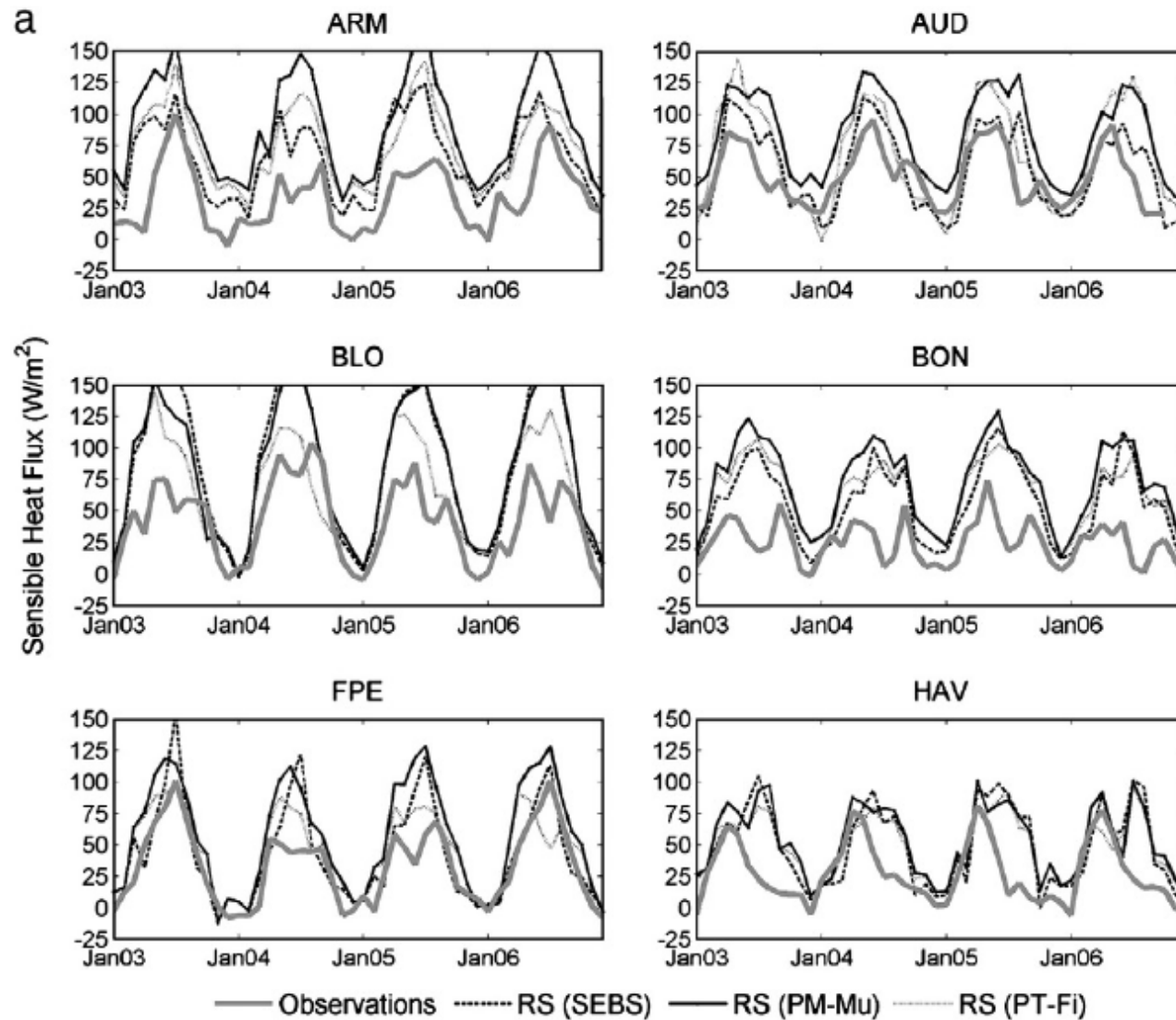
Results – comparison against tower data: Latent heat flux



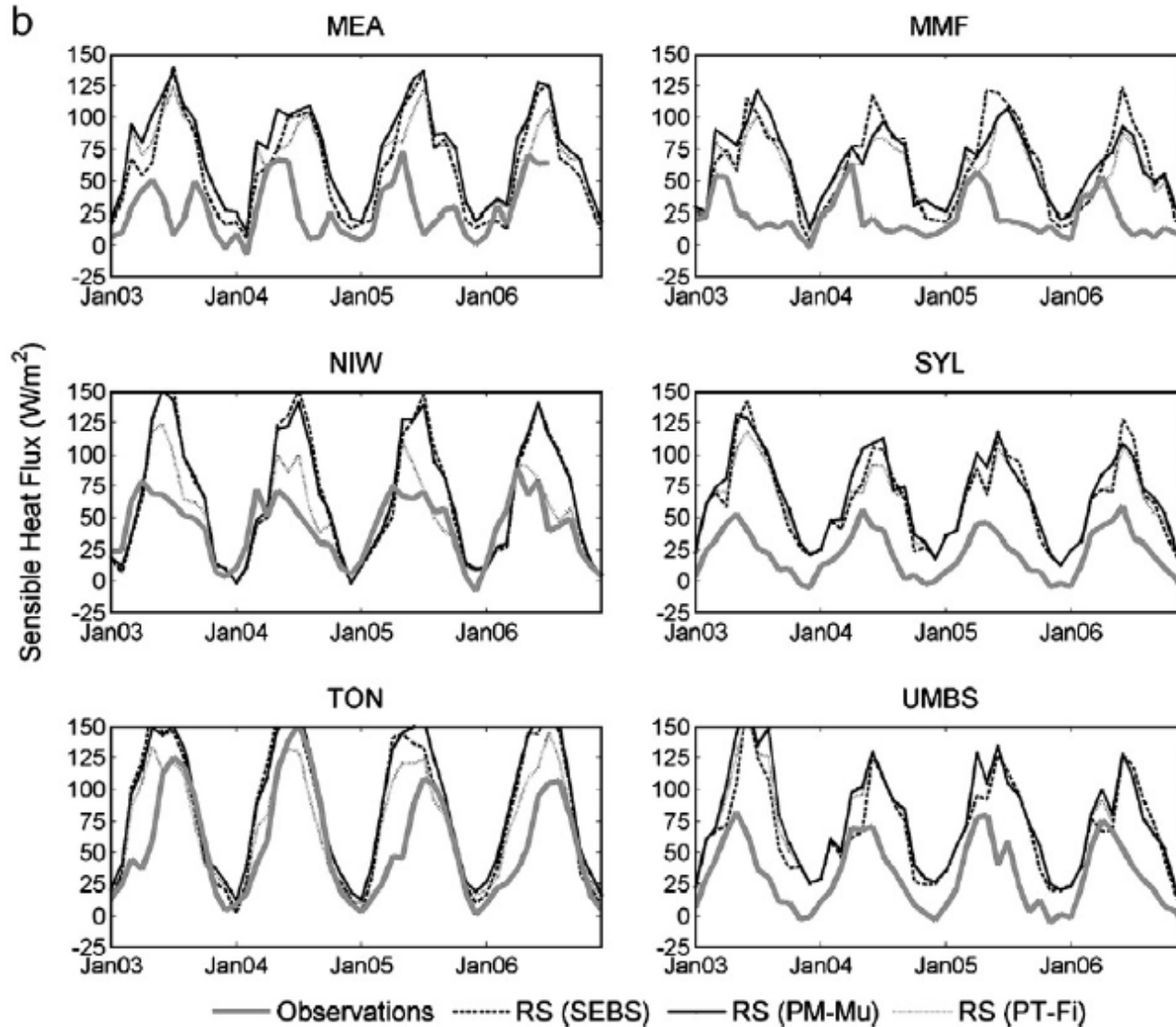
Latent heat flux - continued



Comparison against tower data: Sensible heat flux



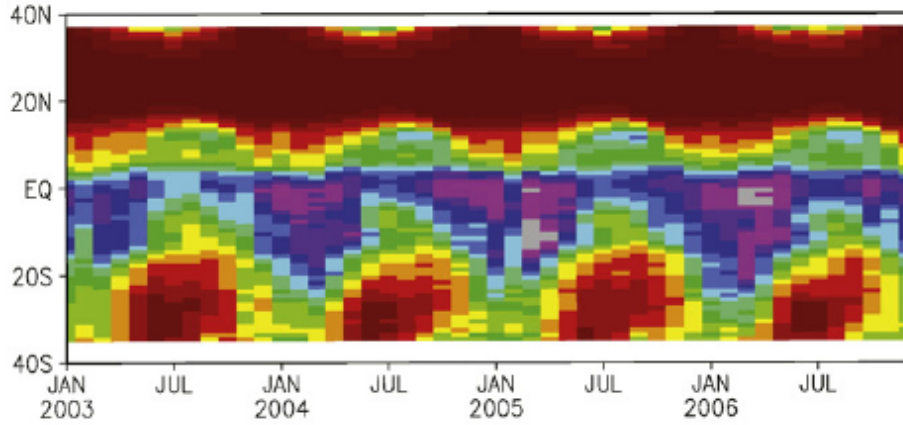
Sensible heat flux - continued



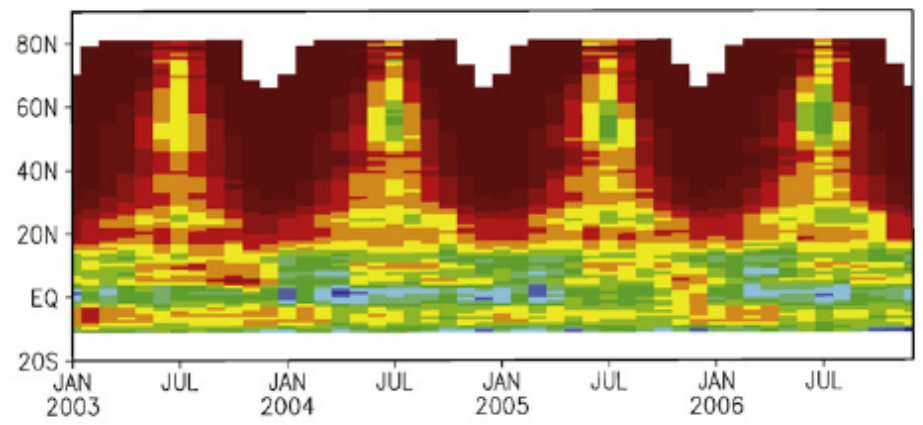
Continental/global scale

- Results presented in a zonal monthly Hovmöller diagram of the mean (of the 3 models used) evapotranspiration (mm/month) for the 6 continents.

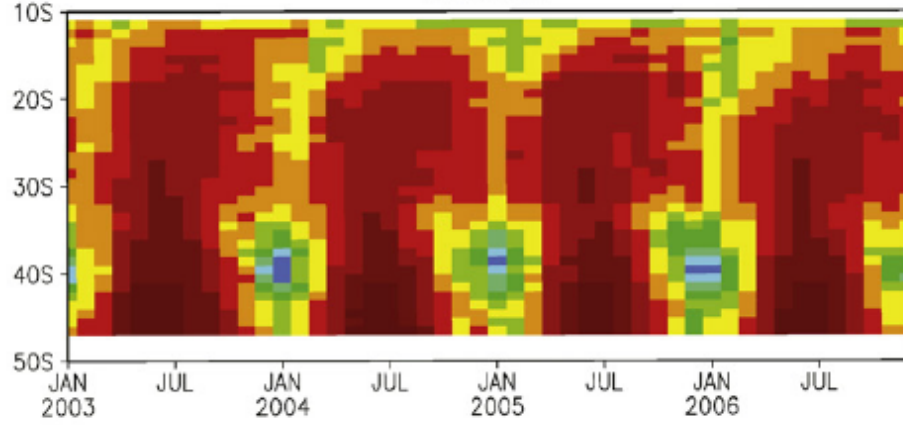
Africa



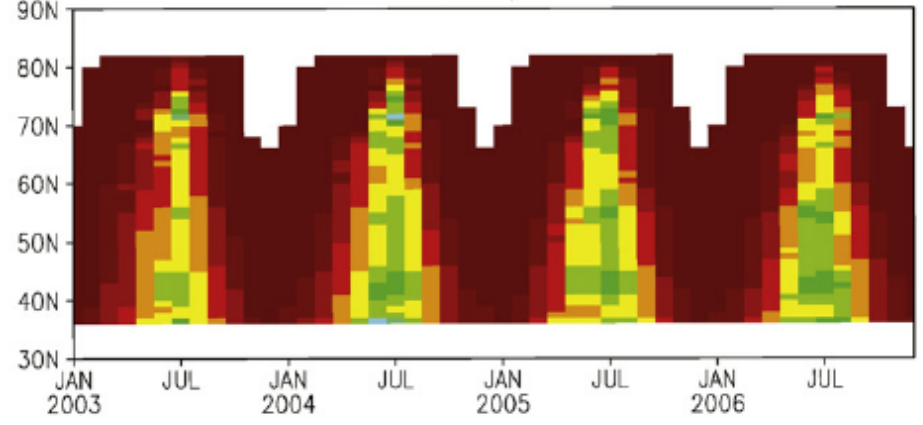
Asia



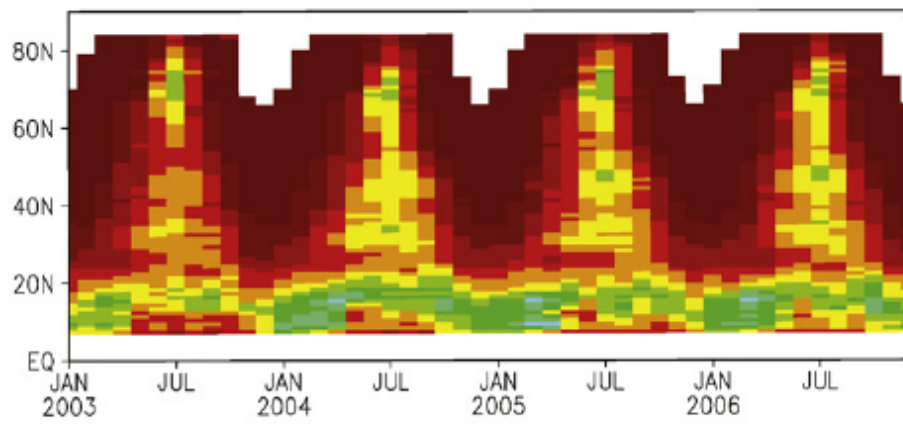
Australia



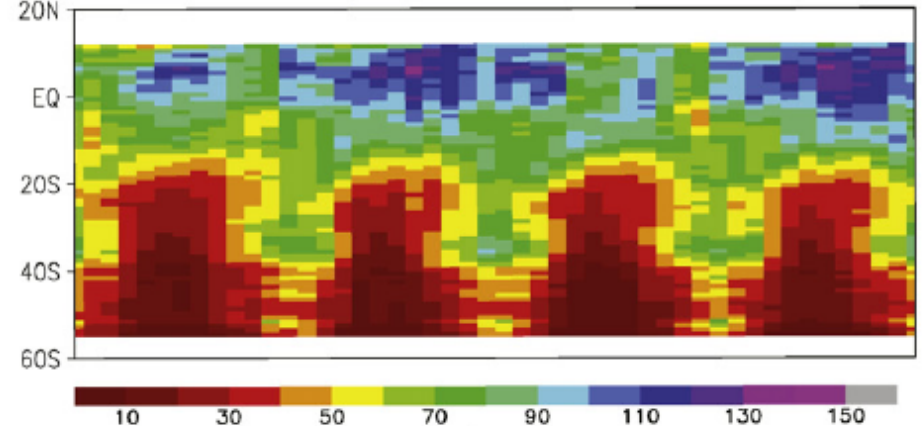
Europe



North America

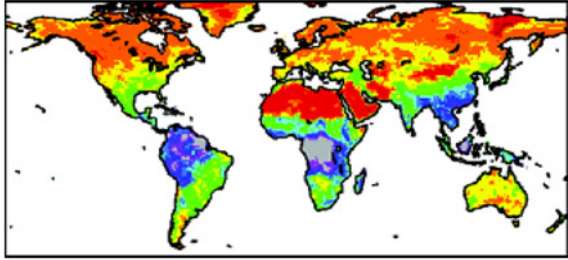


South America

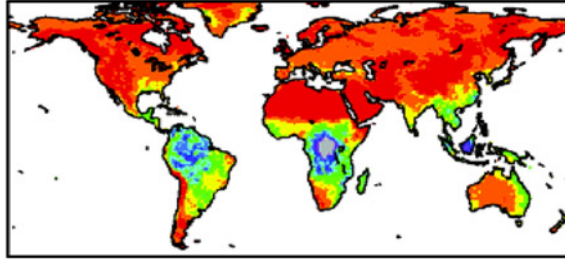


Global annual ET for years 2003 through 2006

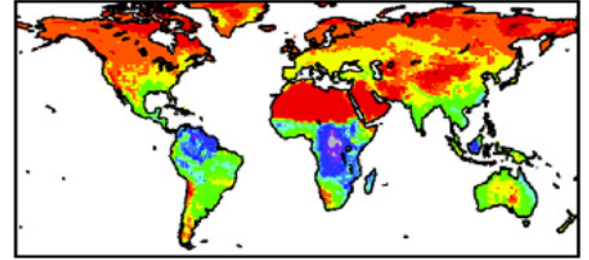
SEBS - 2003



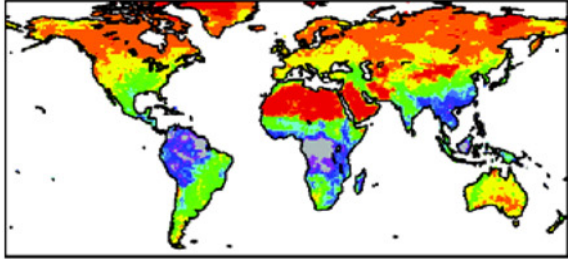
PM-Mu - 2003



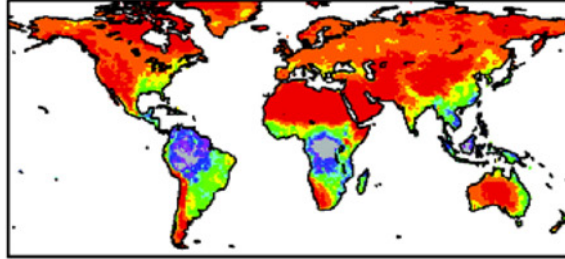
PT-Fi - 2003



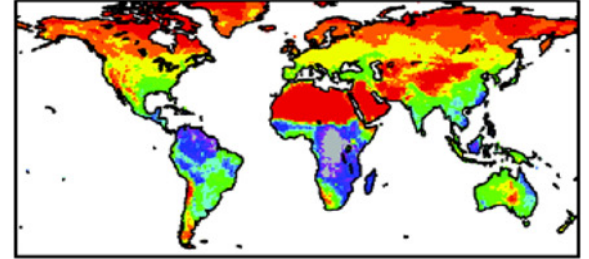
SEBS - 2004



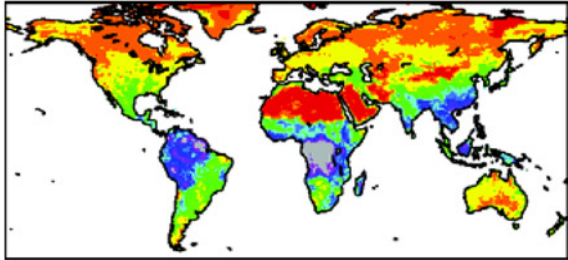
PM-Mu - 2004



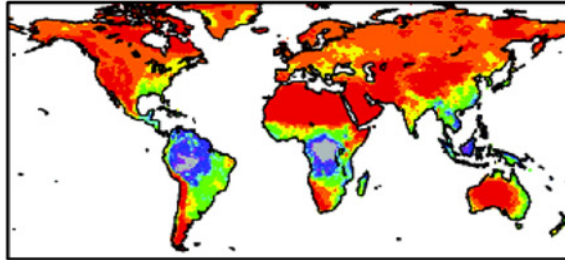
PT-Fi - 2004



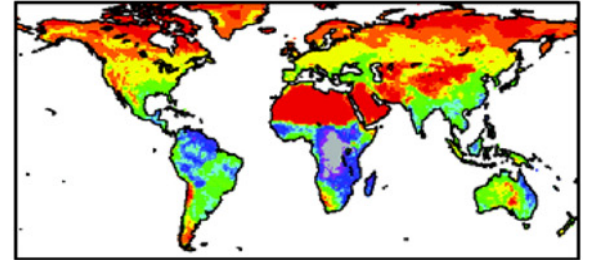
SEBS - 2005



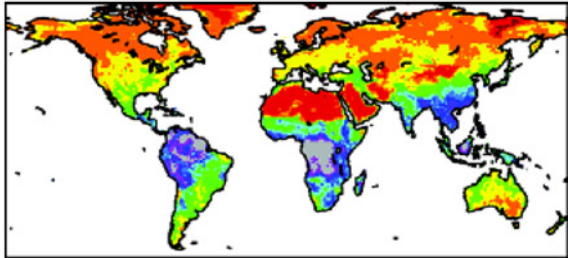
PM-Mu - 2005



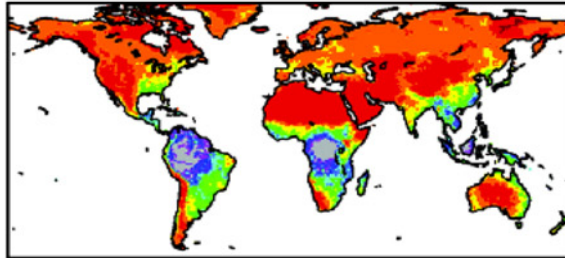
PT-Fi - 2005



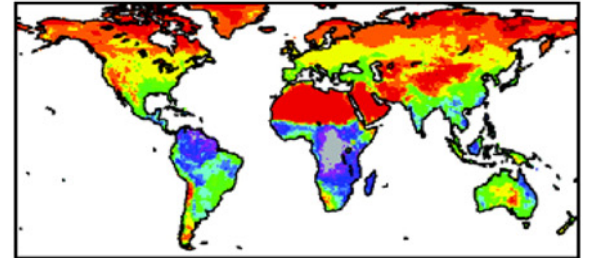
SEBS - 2006



PM-Mu - 2006



PT-Fi - 2006



Conclusions

Small scale comparison

- Correlations of 0.43-0.54 in the instantaneous LE fluxes between remote sensing and tower fluxes
- Correlations of 0.51-0.65 in monthly ET, RMSD: 20-27 W/m²

Regional / global scale comparison

- Basin scale comparison – RS ET estimates vs. evaporation from climatological precipitation and basin discharge - agree well
- Global scale – compared to VIC surface model and ERA interim reanalysis data – had higher Kendall's T coefficient and lower bias
- PM-Mu algorithm provides a lower estimate of ET compared to SEBS and PT-Fi. (Examples: central Asia, Australia, Europe, Western US)