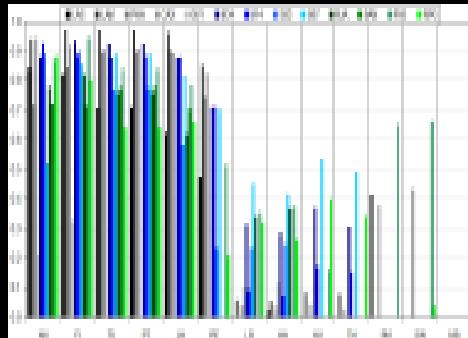


THE TROPICAL LAND- ATMOSPHERE WATER FLUX

measurements, models & controls for
evapotranspiration in the Amazon



Joshua B. Fisher & Yadvinder Malhi

Alessandro C. de Araújo, Damien Bonal, Humberto R. da Rocha, Michael L. Goulden, Takashi Hirano, Tomo'omi Kumagai, Hank Loescher, Scott Miller, Antonio D. Nobre, Steve Oberbauer, Scott Saleska, Celso von Randow, Kevin P. Tu

LARGE SCALE BIOSPHERE-ATMOSPHERE EXPERIMENT (LBA)

TROPICAL *LE*

- Hadley cells, global climate, atmospheric circulation, sea surface temperature
 - Radiation, cloud formation, rainfall
 - *LE* recycling
- 2 problems:
 - 1) Understanding based on models, but models developed for temperature/agriculture
 - 2) *LE* measurements → extrapolation



687 mi

Image NASA
Image © 2007 TerraMetrics

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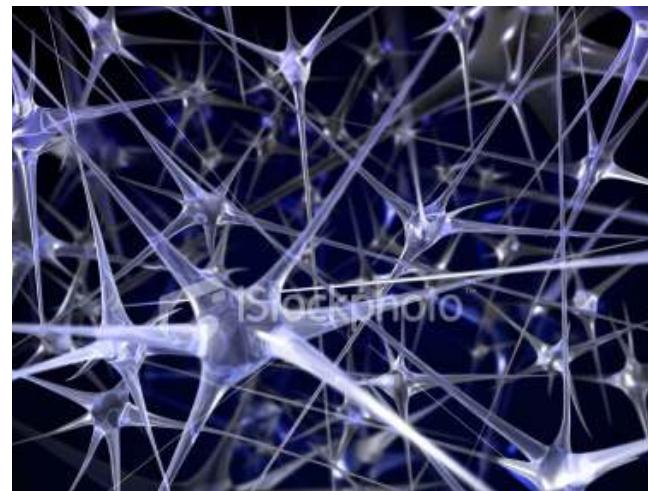
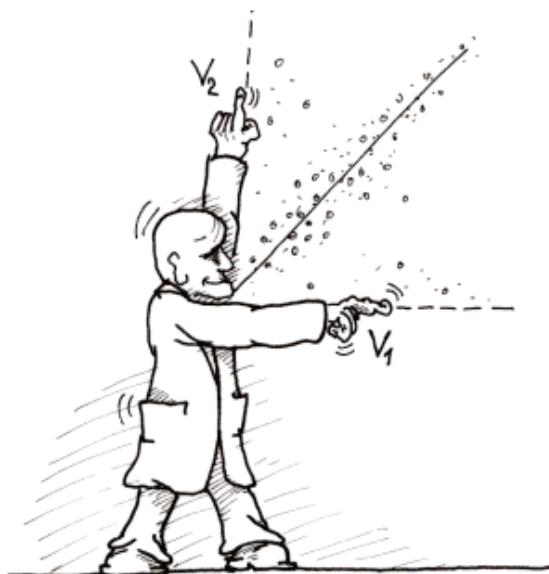
LE CONTROLS

- LAI
- Albedo
- Wind speed
- Precipitation
- Net radiation
- Soil moisture
- Soil resistance
- Air temperature
- Stomatal resistance
- Vapor pressure deficit
- Aerodynamic resistances
- Boundary layer resistance



ANALYSIS

- 1) Correlations between potential controls & *LE*
- 2) Neural network neuron importance ranks
- 3) Performance evaluation for suite of models

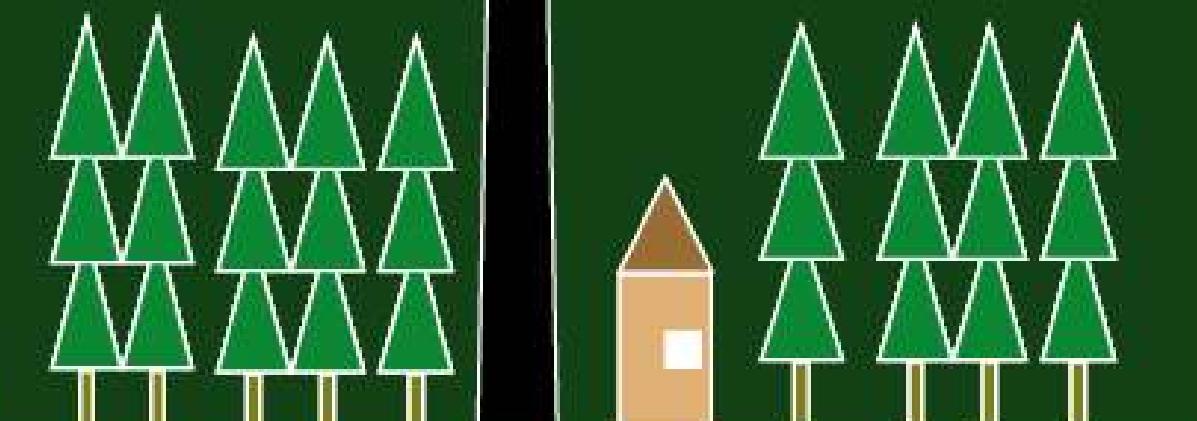


EDDY COVARIANCE



$$F_{H_2O} = \overline{w' H_2O'}$$

Flux = time avg.
covariance of
vertical wind and
 H_2O concentration



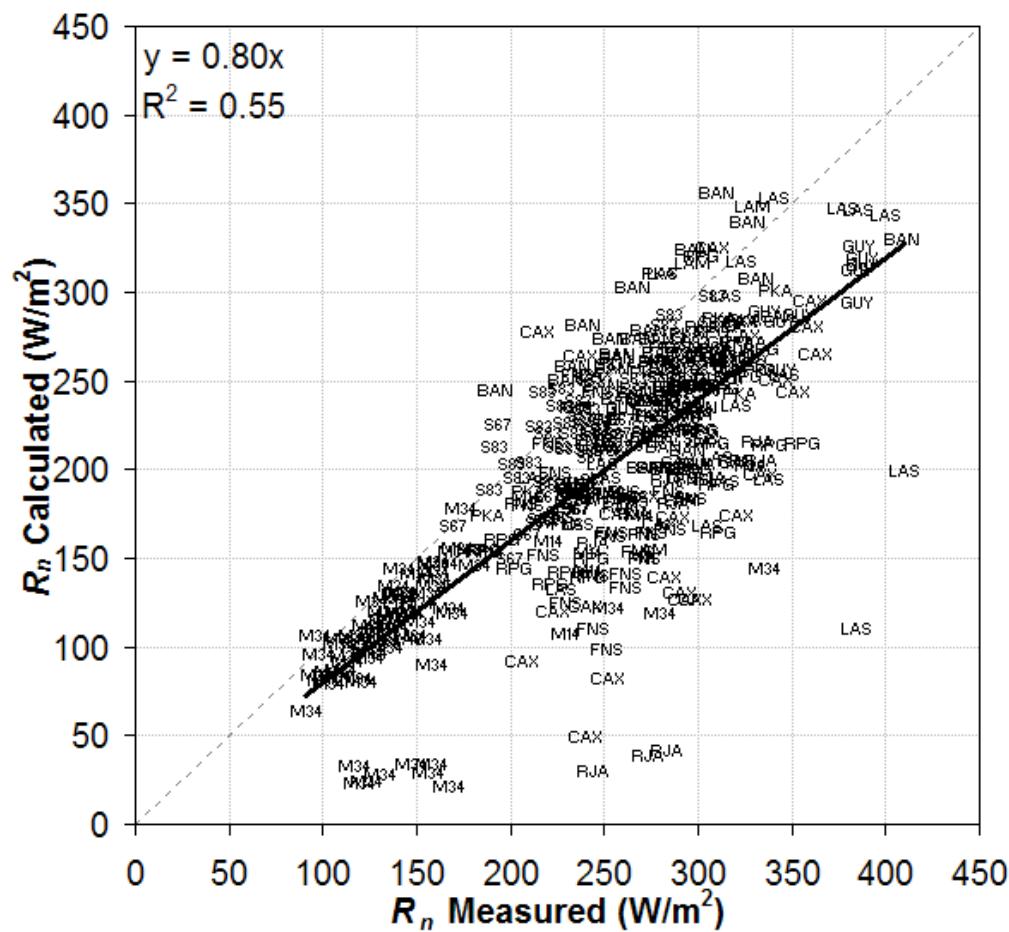
Adapted from A. Goldstein

EDDY FLUX SITES



R_n CLOSURE

$$R_n = LE + H + G + S$$



LE MODELS

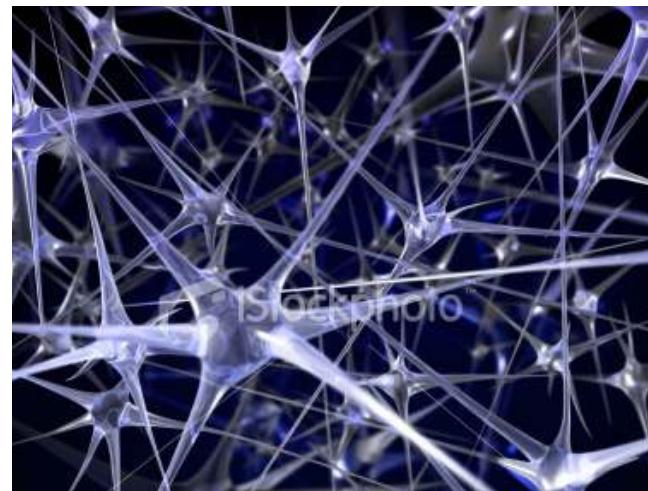
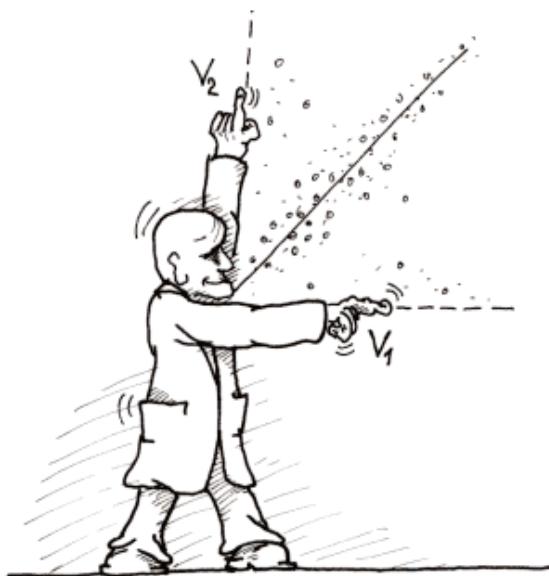
Thornthwaite (1948) – TH $1.067\Lambda \left(\frac{10T_a}{S_T} \right)^4$	Penman-Monteith (1965) – PM $\frac{\Delta R_n + c_p \rho VPD / r_a}{\Delta + \gamma + \gamma(r_c / r_a)}$
Penman (1948) – PE $\frac{\Delta R_n + 73.64 VPD \rho \gamma (1 + 0.54 u)}{\Delta + \gamma}$	Priestley-Taylor (1972) – PT $\alpha \frac{\Delta}{\Delta + \gamma} R_n$
Turc (1961) – TU $\frac{0.313 T_a (R_s + 2.1)}{T_a + 15}$	McNaughton-Black (1973) – MB $\frac{c_p \rho VPD}{\mathcal{W}_c}$
Hamon (1963) – HA $\frac{715.5 \Lambda 0.61121 e^{\frac{17.502 T_a}{T_a + 240.97}}}{T_a + 273.2}$	Shuttleworth-Wallace (1985) – SW $PM_c C_c + PM_s C_s$ $PM_c = \frac{\Delta R_n + (c_p \rho VPD - \Delta r_b R_{ns}) / (r_a + r_b)}{\Delta + \gamma (1 + r_c / (r_a + r_b))}$ $PM_s = \frac{\Delta R_n + (c_p \rho VPD - \Delta r_w (R_n - R_{ns}) / (r_a + r_w))}{\Delta + \gamma (1 + r_s / (r_a + r_w))}$ $C_c = \left(\frac{1 + R_c R_a}{R_s (R_c + R_a)} \right)^{-1}$ $C_s = \left(\frac{1 + R_s R_a}{R_s (R_s + R_a)} \right)^{-1}$ $R_a = (\Delta + \gamma) r_a$ $R_s = (\Delta + \gamma) r_w + \gamma r_s$ $R_c = (\Delta + \gamma) r_b + \gamma r_c$
Jensen-Haise (1963) – JH $0.41 R_s (0.025 T_a + 0.078)$	
Hutyra et al. (2005) – HU $1.9 * 30 (0.3764 T_a - 6.7084)$	
Fisher et al. (this study) T_a linear regression – LR $10T_a - 105$	
Fisher et al. (this study) Neural Network – NN $((((0.2 * ((2.1NDVI-1.5)+(0.02R_n-4.4)+(0.002T_a-0.04)+(-0.4VPD+0.5)+(-0.2u+0.3)-1.2)+0.08)/2)+0.5)*426.3)+3.8$	

FC MODEL

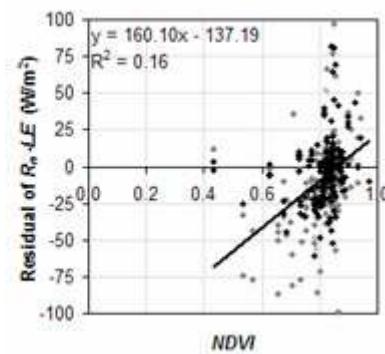
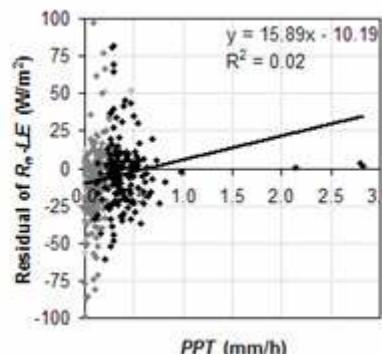
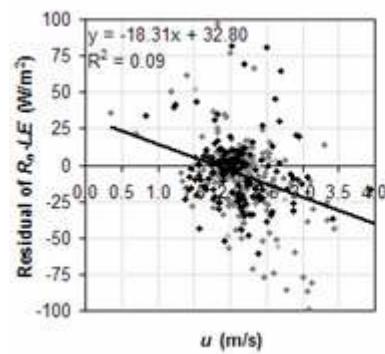
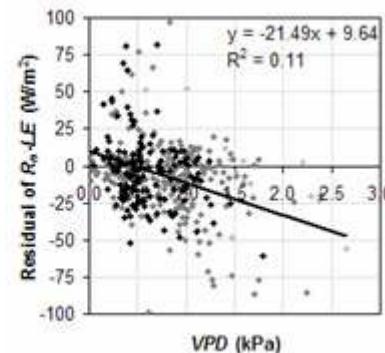
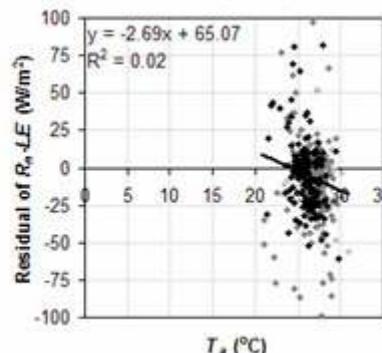
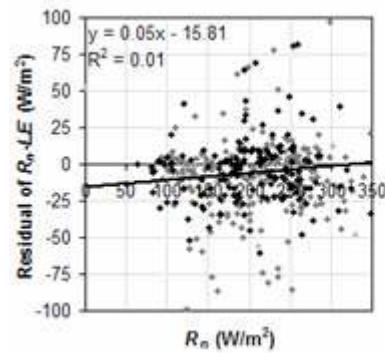
Parameter	Description	Equation	
LE	Evapotranspiration	$LE_s + LE_t + LE_i$	
LE_t	Canopy transpiration	$(1 - f_{ws}) f_\varepsilon f_T f_M \alpha \frac{\Delta}{\Delta + \gamma} R_{ws}$	
LE_s	Soil evaporation	$(f_{ws} + f_{SM}(1 - f_{ws})) \alpha \frac{\Delta}{\Delta + \gamma} (R_{ws} - G)$	
LE_i	Interception evaporation	$f_{ws} \alpha \frac{\Delta}{\Delta + \gamma} R_{ws}$	RS derived – $f(R_s, a, clouds)$
f_{ws}	Relative surface wetness	RH^4	RS derived – $f(ea)$
f_ε	Green canopy fraction	$\frac{f_{APAR}}{f_{IPAR}}$	RS derived – $f(NDVI)$
f_T	Plant temperature constraint (June et al., 2004)	$\exp\left(-\left(\frac{T_{max} - T_{opt}}{T_{opt}}\right)^2\right)$	RS derived – $f(T_s)$
f_M	Plant moisture constraint	$\frac{f_{APAR}}{f_{APARmax}}$	RS derived – $f(NDVI)$
f_{SM}	Soil moisture constraint	$RH^{VPD/\rho}$	RS derived – $f(ea)$

ANALYSIS

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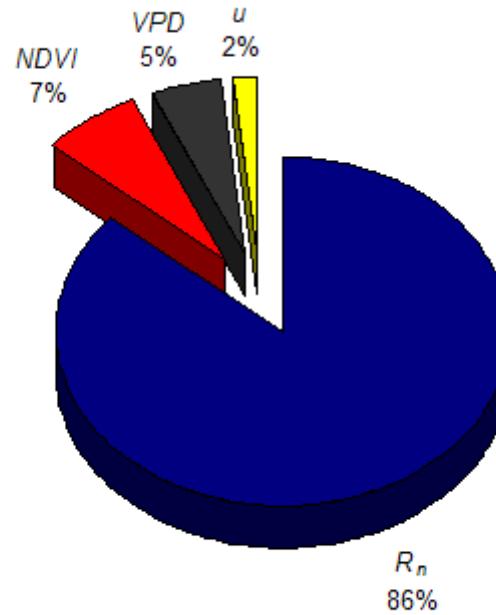
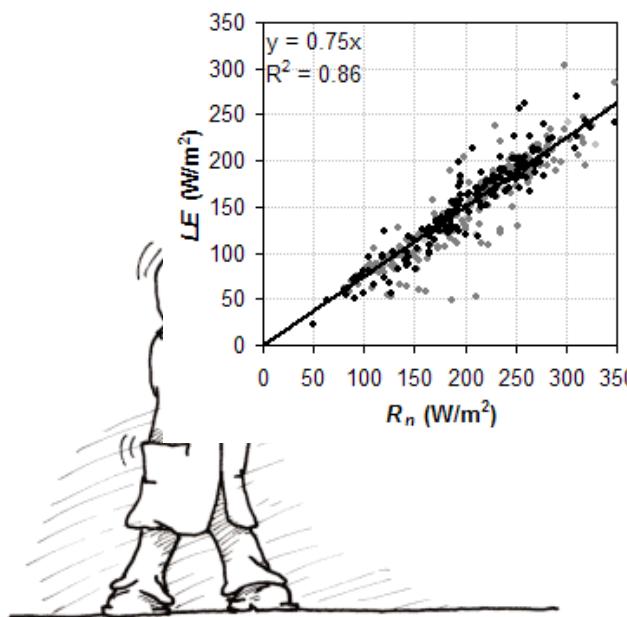


LE VS. CONTROLS



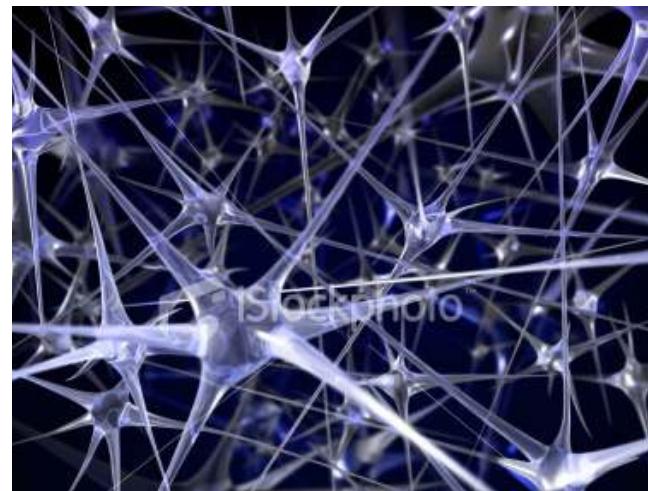
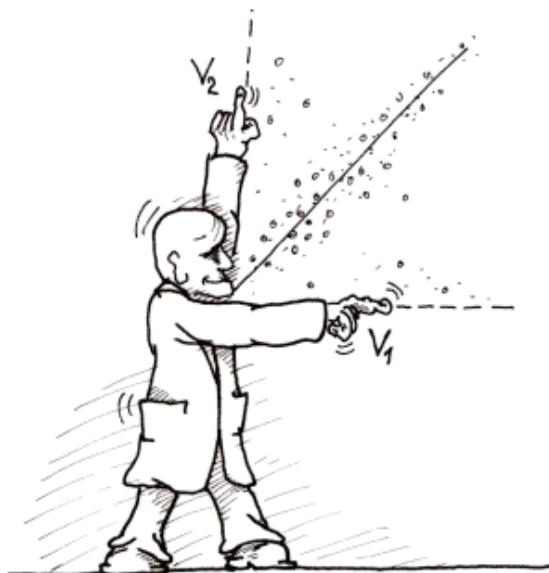
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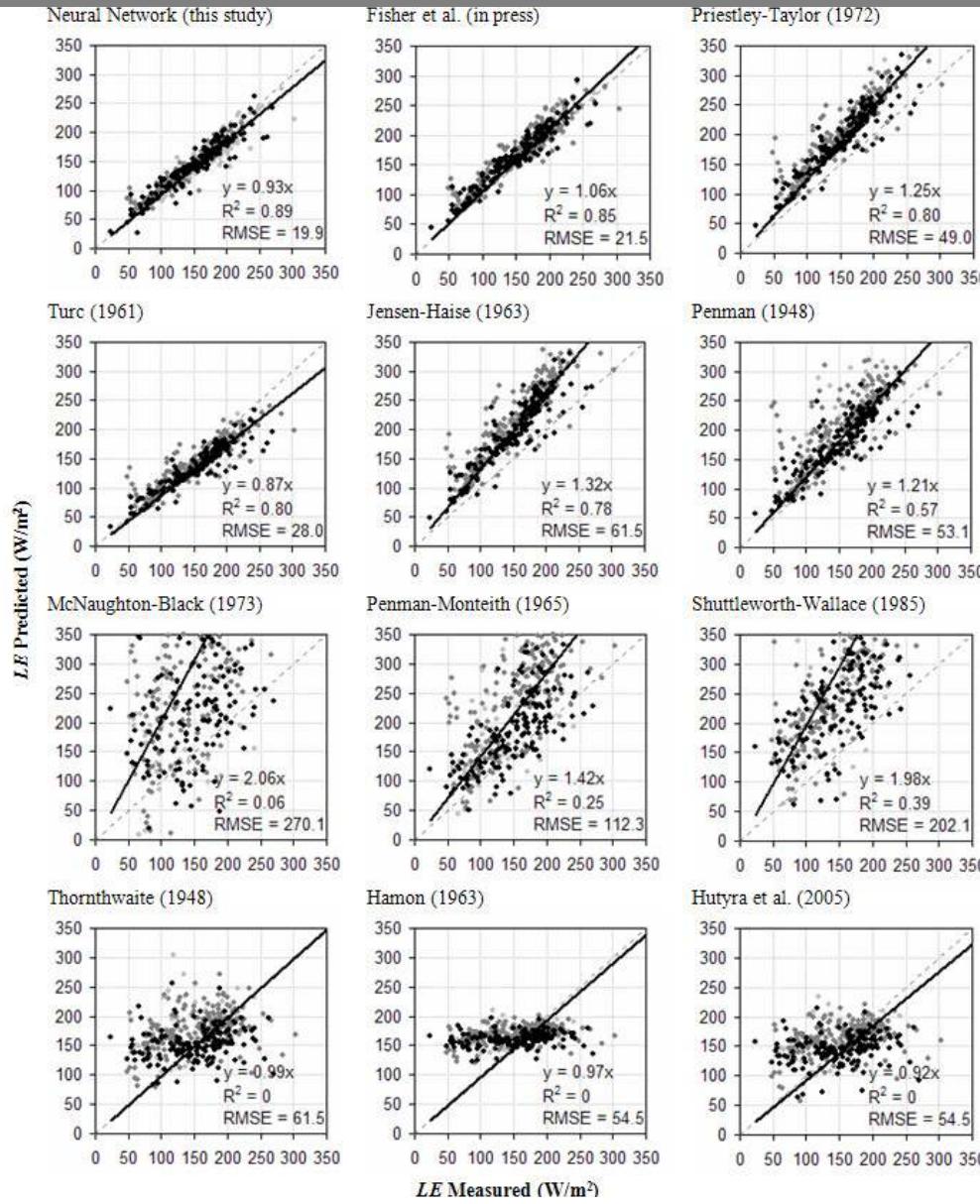


ANALYSIS

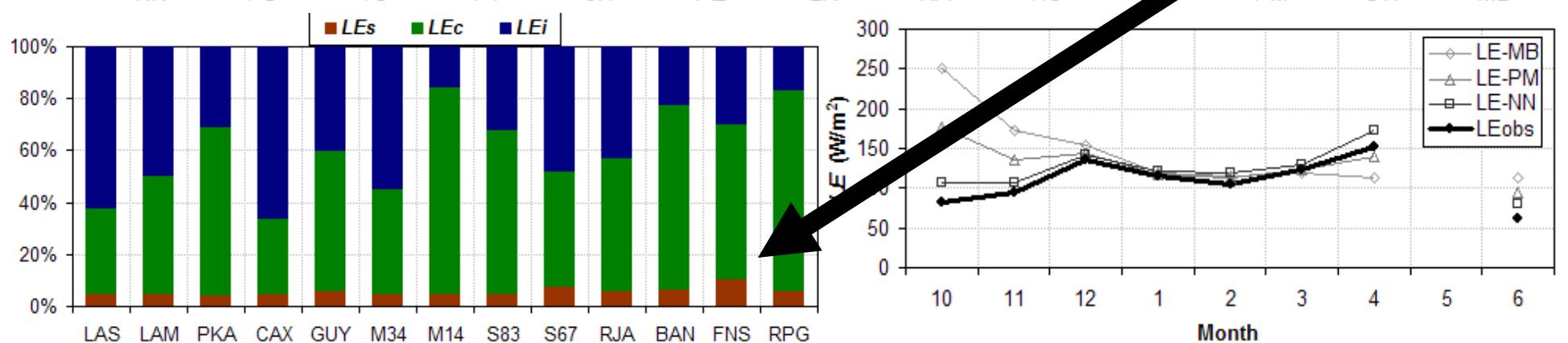
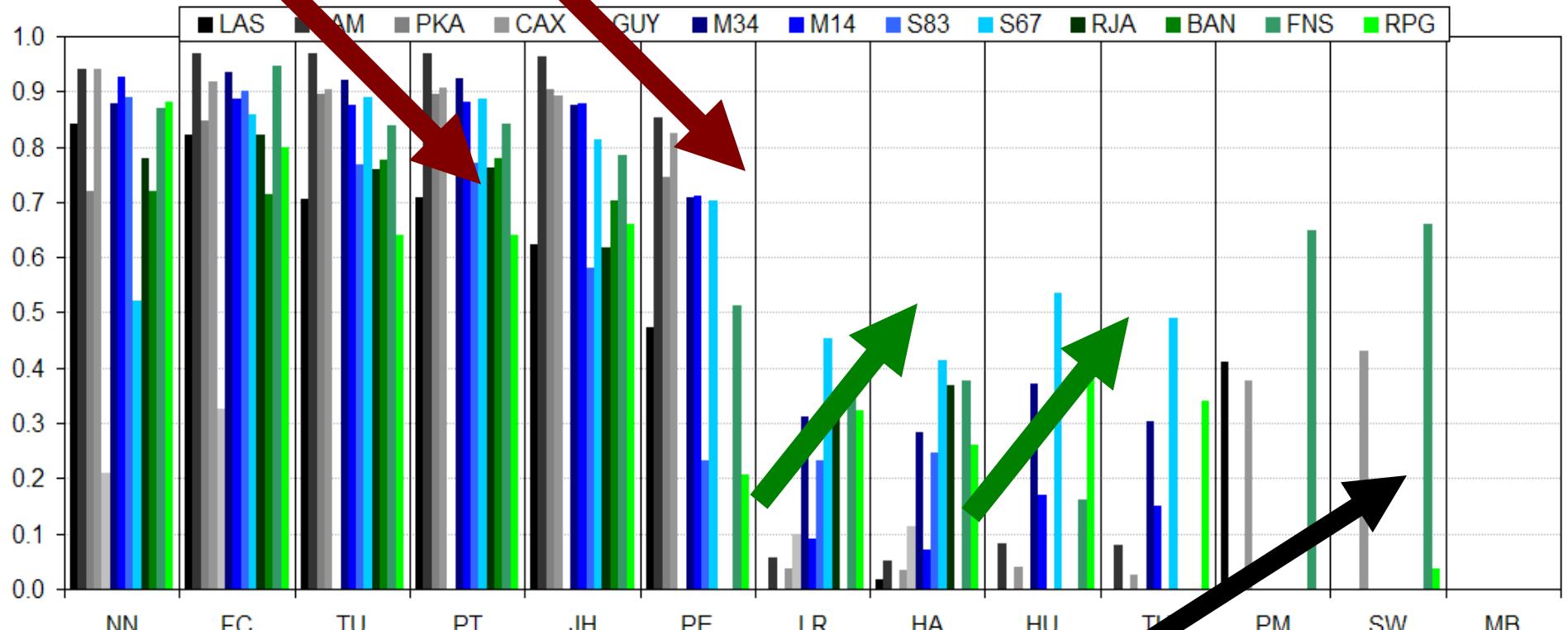
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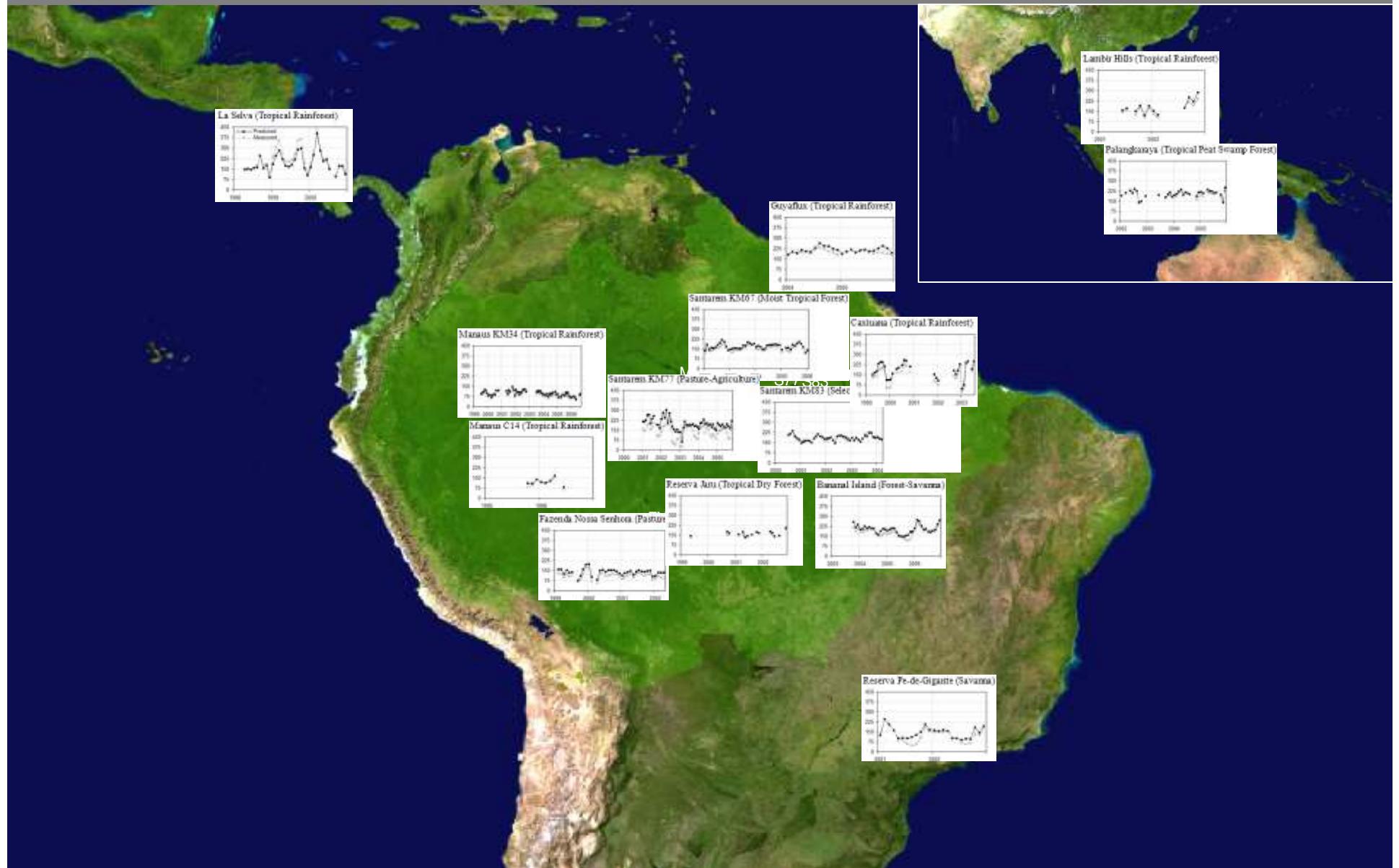
MODELS EVALUATION



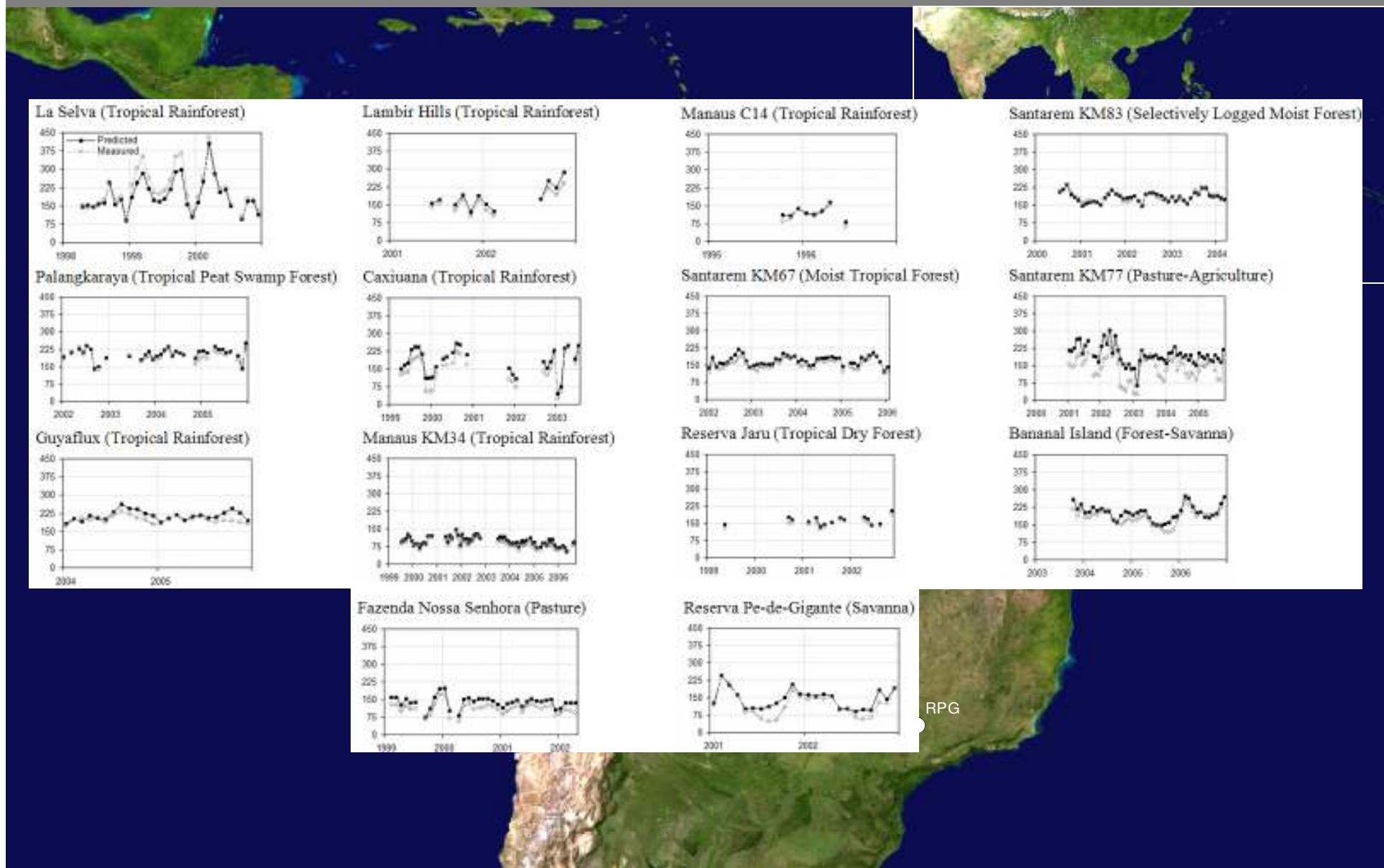
MODELS EVALUATION



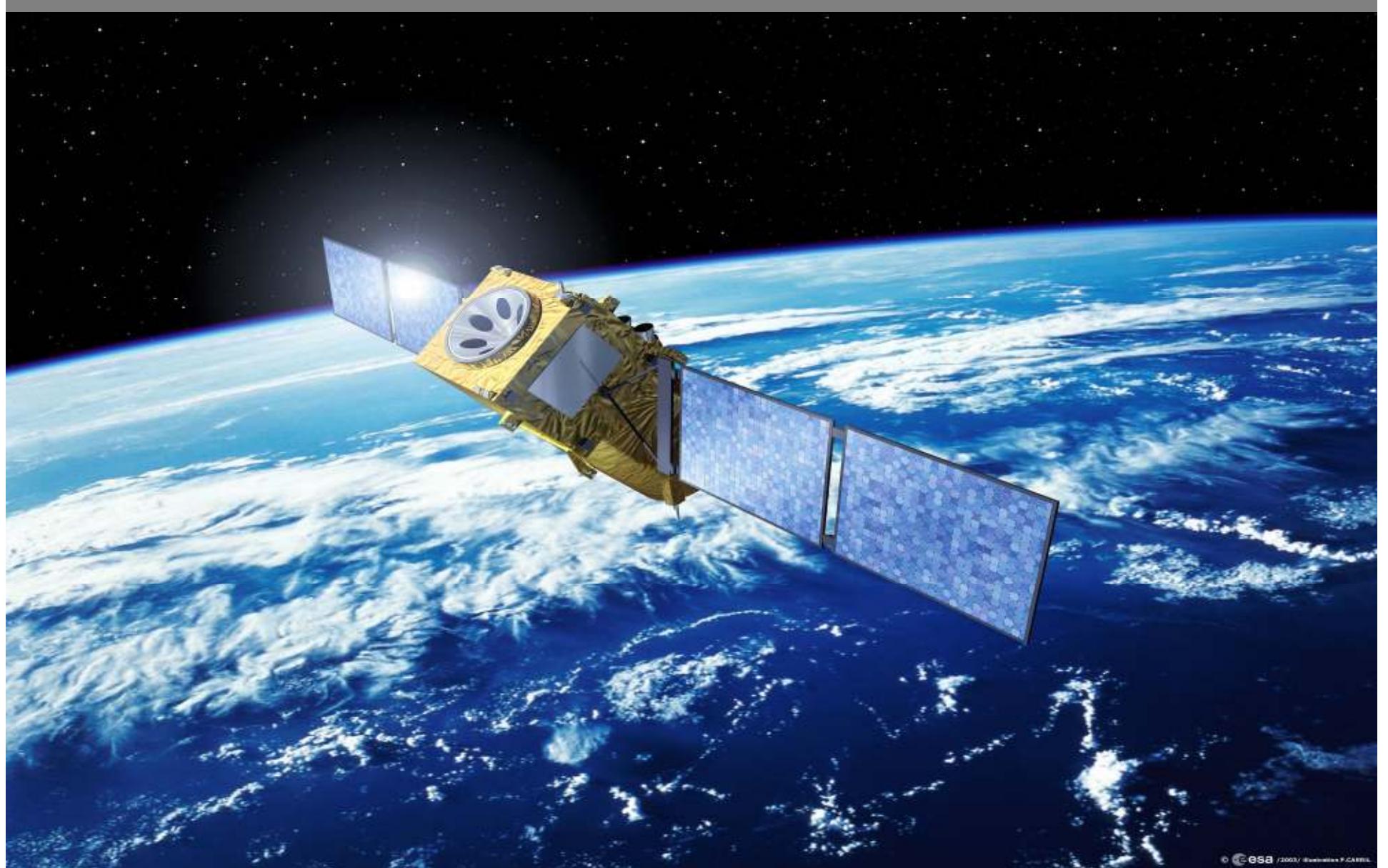
MODELS EVALUATION



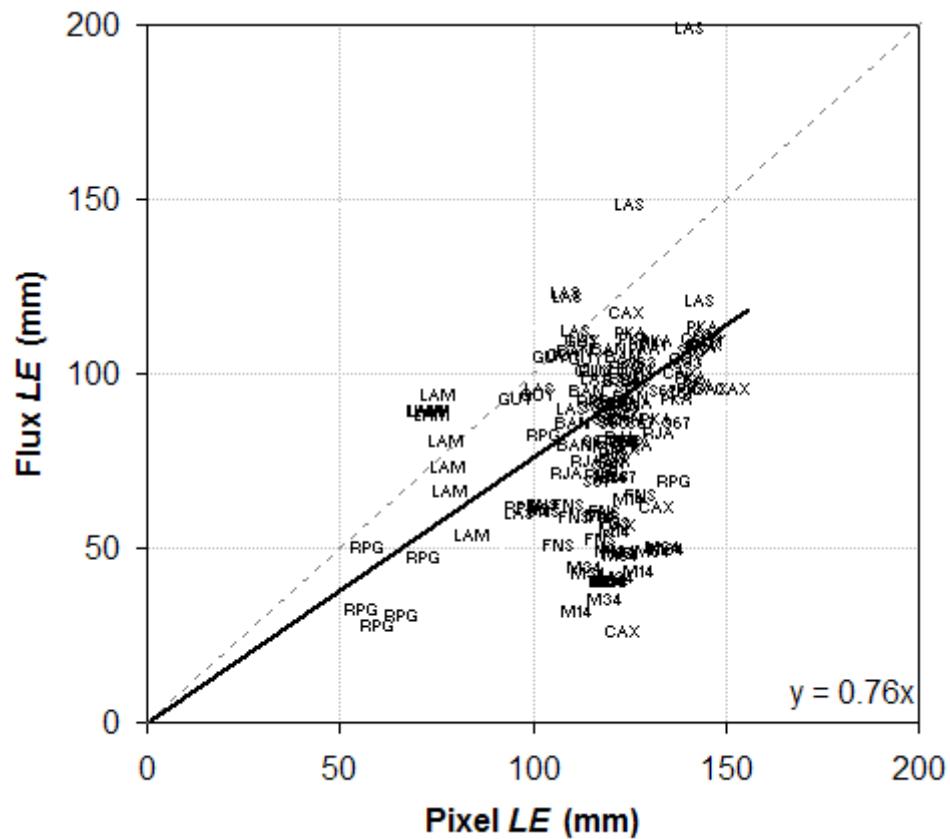
MODELS EVALUATION



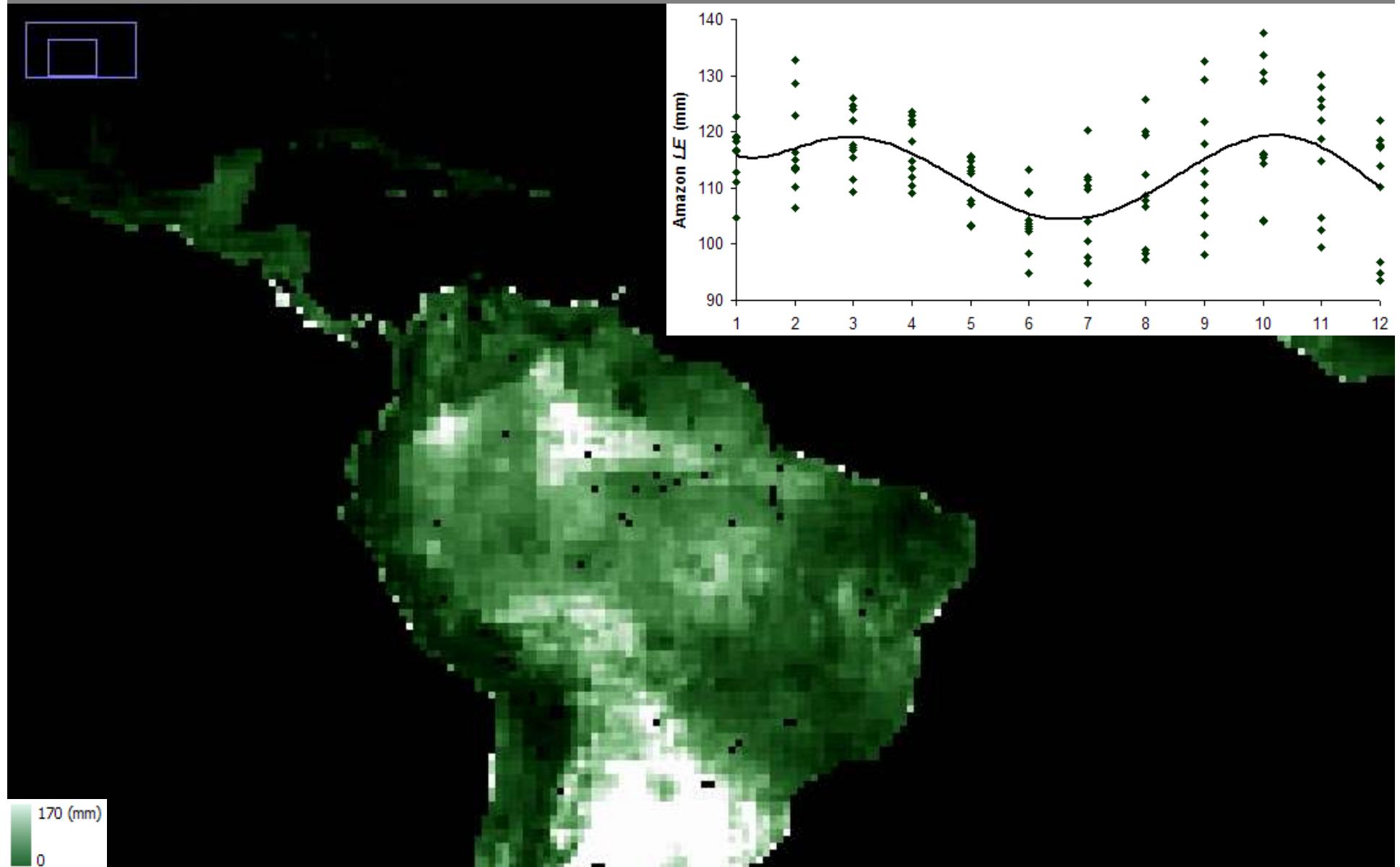
REMOTE SENSING



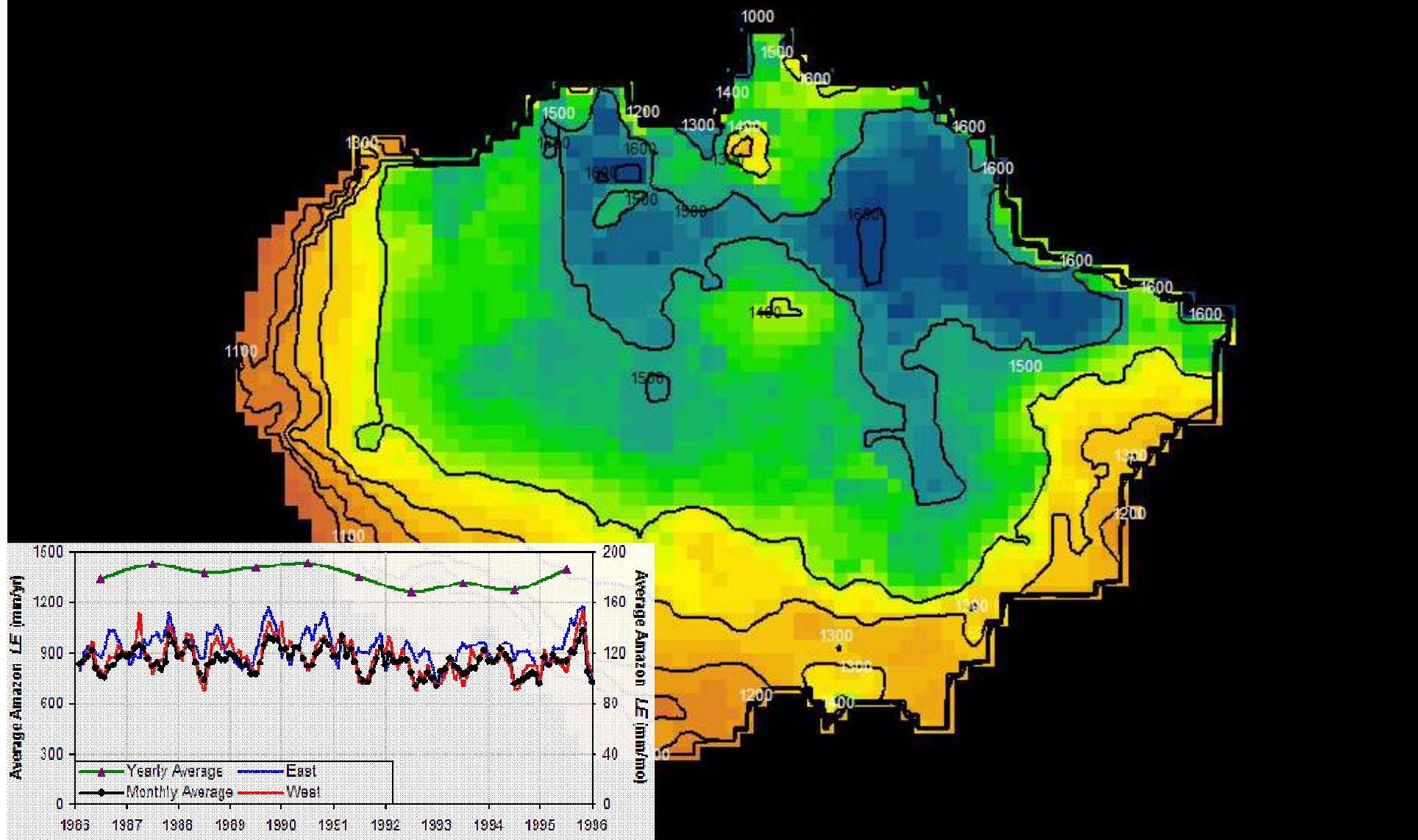
PIXEL VS. TOWER



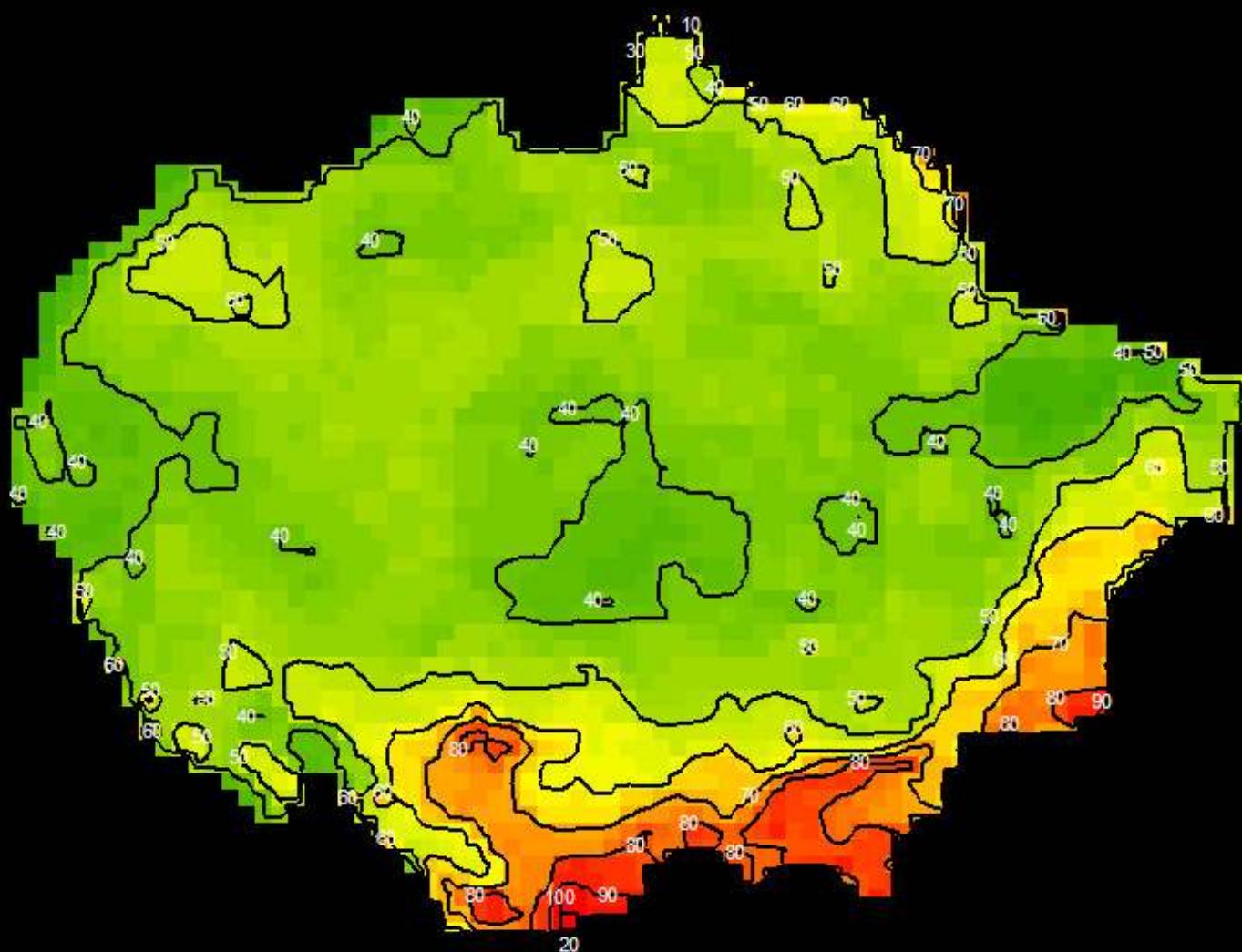
AMAZON MONTHLY LE



10-YEAR MEAN LE



10 - YEAR LE AMPLITUDE



CONCLUSIONS

- LE uses 75% of R_n
 - 67% in central Amazon (Malhi et al. 2002); 73% in eastern Amazon (Sommer et al. 2002); seasonality?
- $VPD, NDVI$ links
 - Malhi et al. 2002, Myneni et al. 2007, Williams et al. 1998
- PPT, T_a NOT linked in moist tropics; seasonality
 - Malhi et al. 2002, Costa & Foley 1997, Nepstad et al. 1994 for PPT
- NN not significantly better than FC
 - T_a -based models performed poorly
- Energy balance: 80%
 - Pixel-to-flux ratio: ~80%; NN ($R_{n,calc}$ -trained)-to-FC ratio: ~80%
- Amazon LE 10-year mean: 1370 mm
 - Assumptions about energy balance; ISLSCP-II and FC model