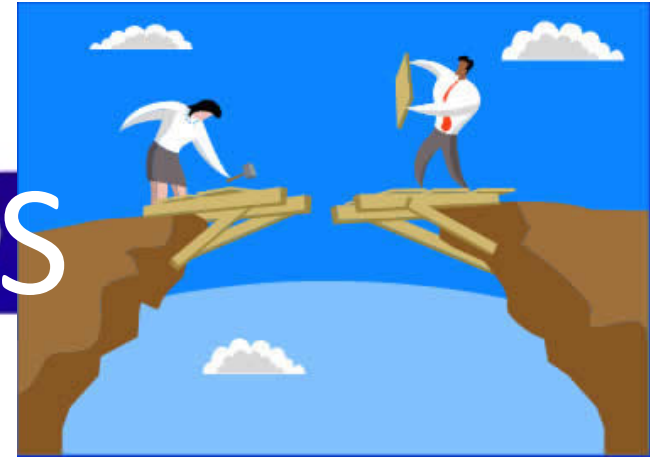




MIND THE GAP



Jing M. Chen¹, Holly Croft¹, Ting Zheng¹, Gang Mo¹,
Shezhou Luo¹, John Miller², Tom Noland³, and others

¹*Department of Geography
University of Toronto, Canada*

²*York University*

³*Ontario Institute of Forest Research*

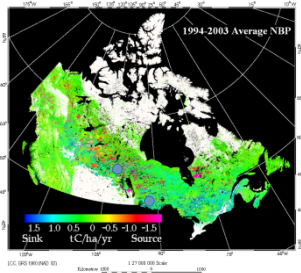


FIFE and BOREAS Workshop
4-5 October 2016, Greenbelt, Maryland, USA

Where Are the Gaps?



Gaps within a canopy
(between and within tree crowns)



Gaps between sites
(density, cover type)

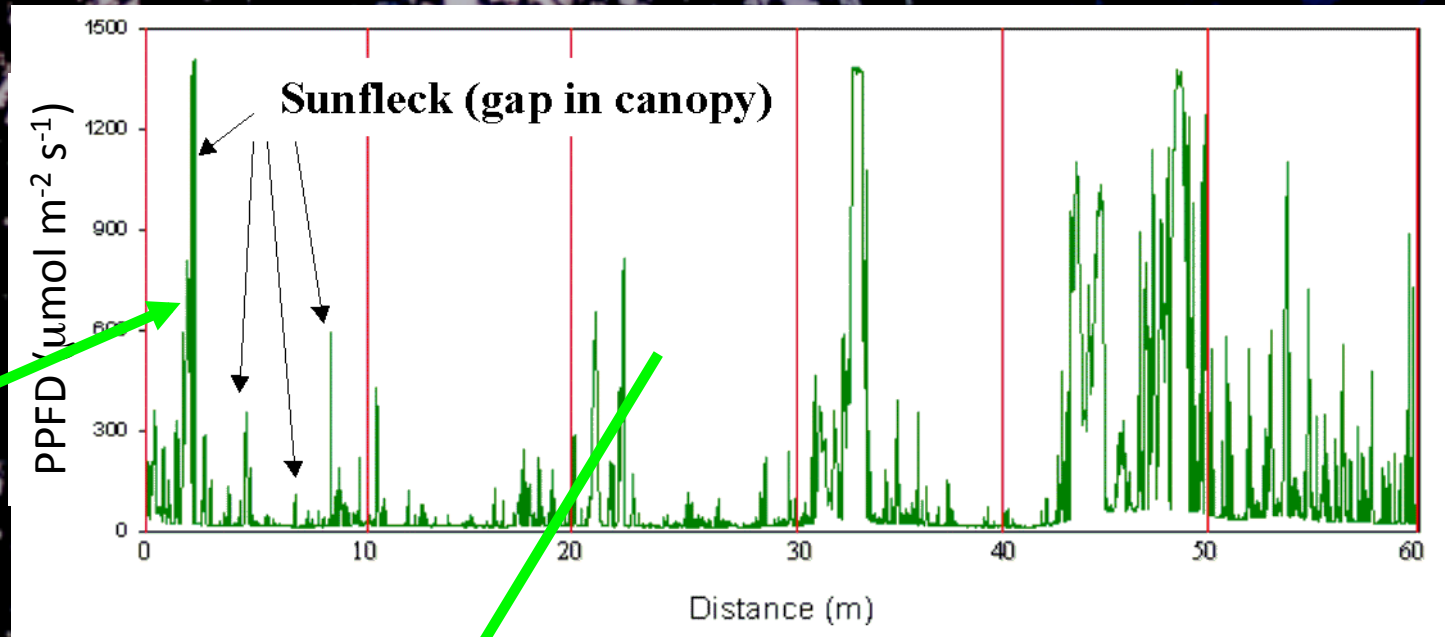
Remote Sensing

Canopy structural parameters

Leaf biophysical traits and function

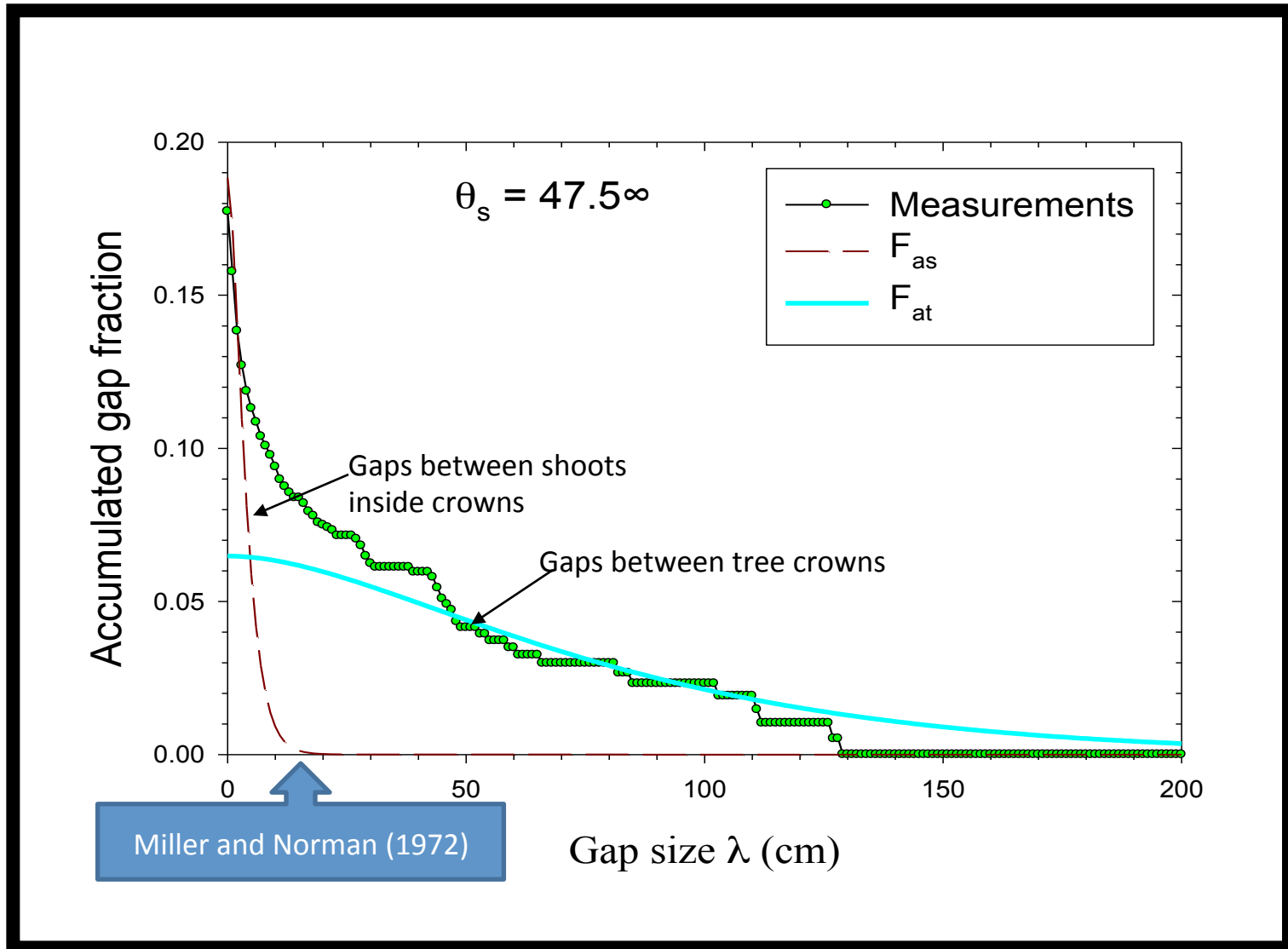


TRAC for Measuring LAI

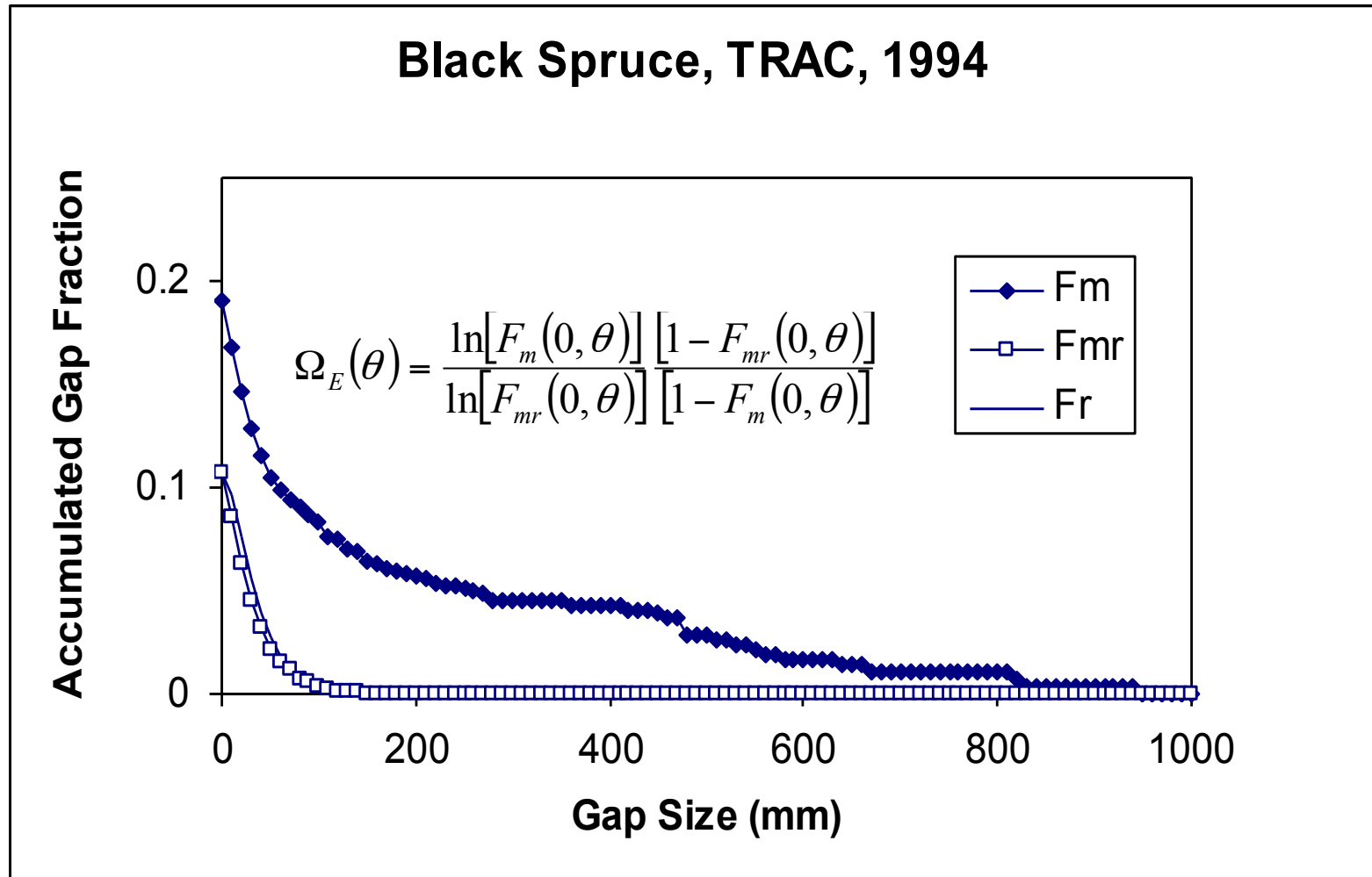


$\Omega_p \rightarrow \text{LAI}$

Accumulated Gap Fraction in a Black Spruce Stand



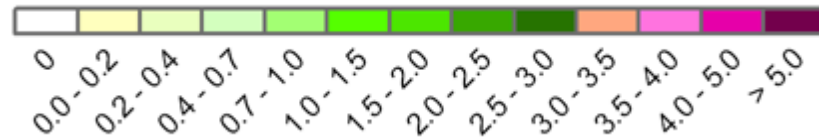
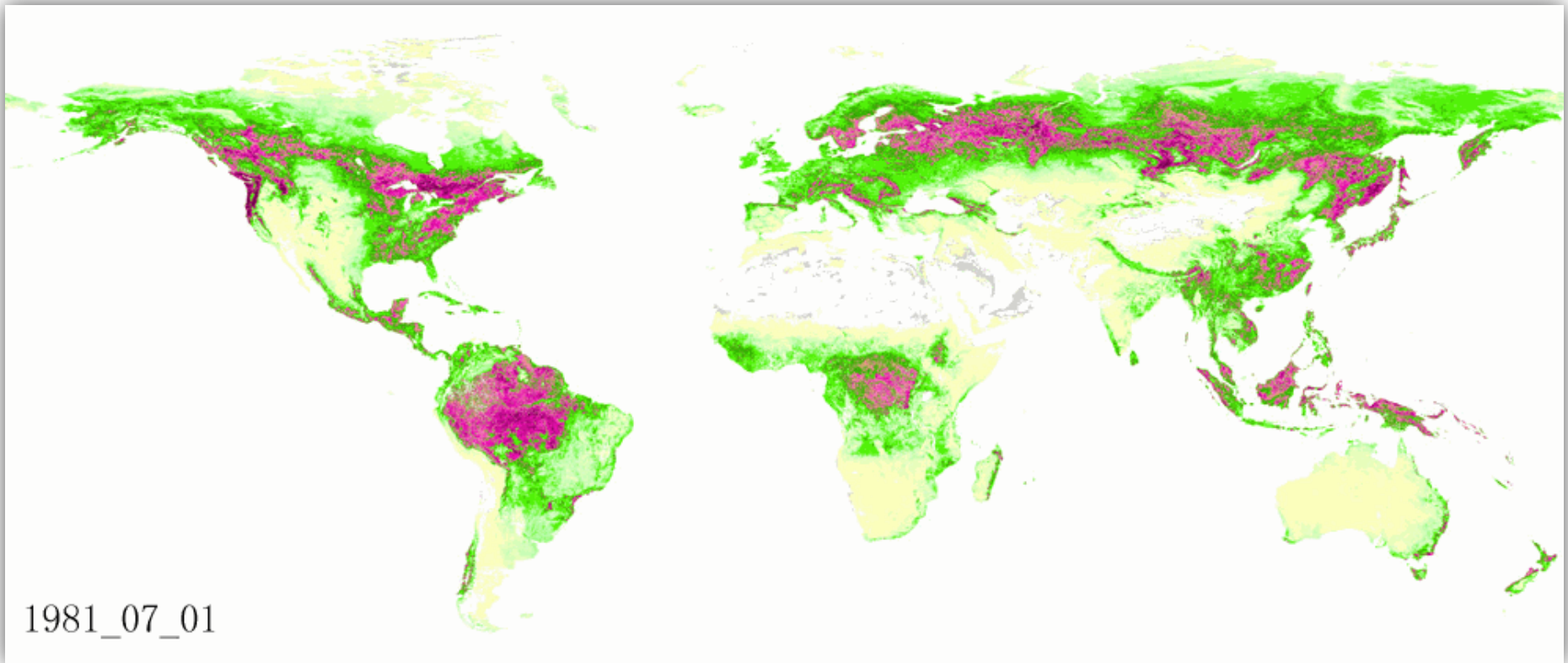
Clumping Index (Ω) Derived After Gap Removal



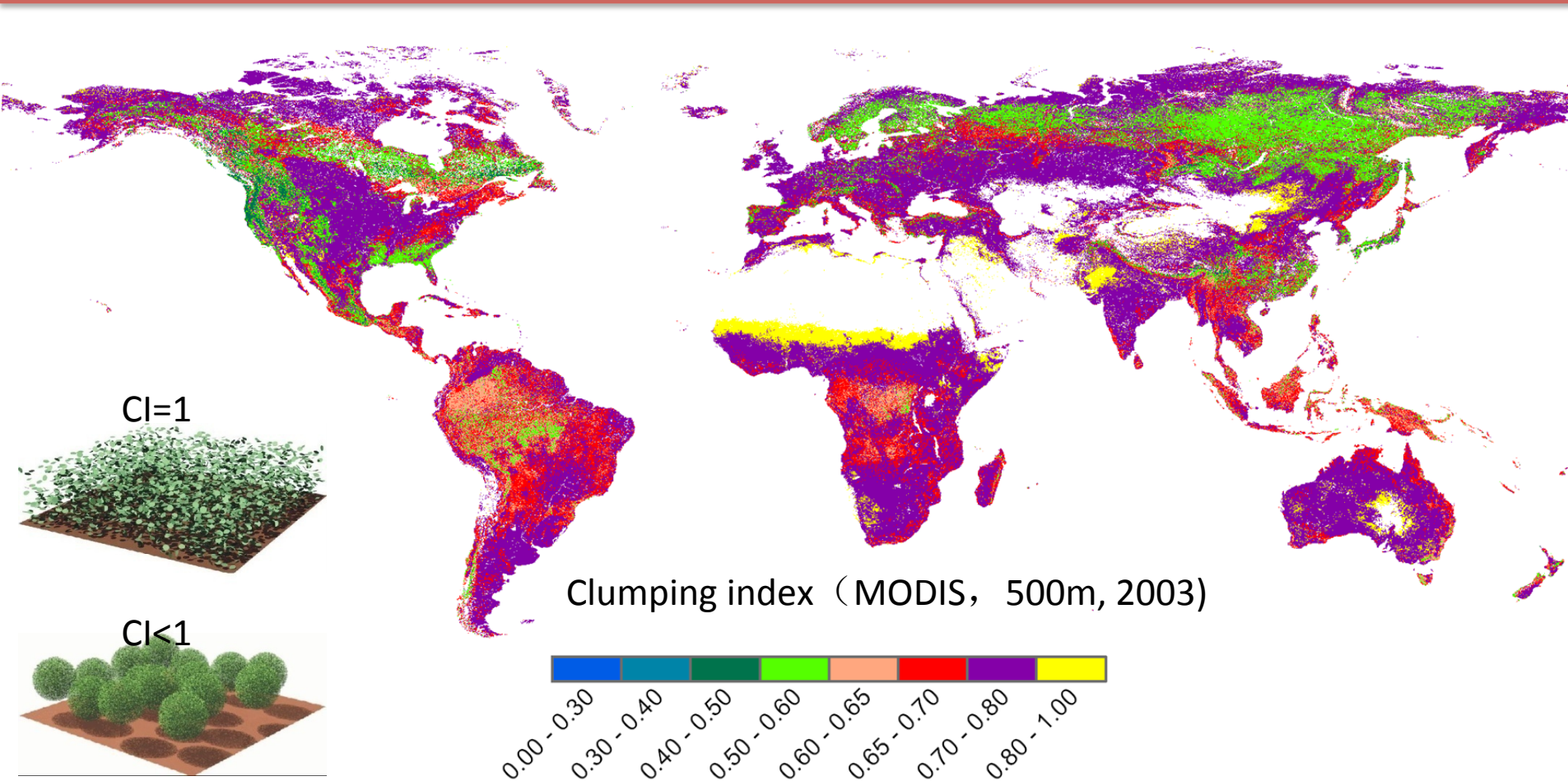
Chen and Cihlar (1995); Leblanc (2002)

Global LAI Time Series

(1981-2010, AVHRR+MODIS, 8 km, 8-day interval)

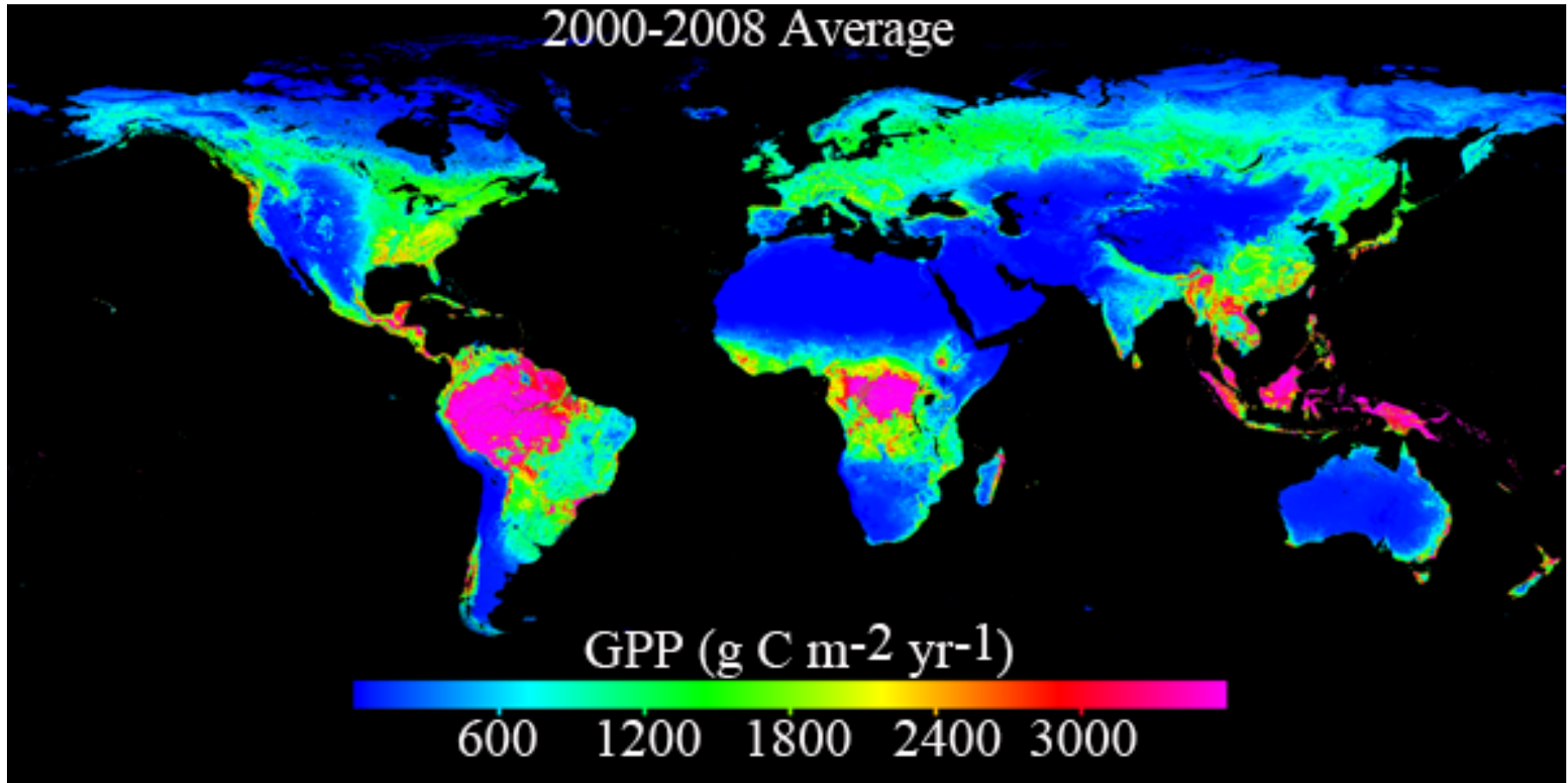


Clumping Index Mapping



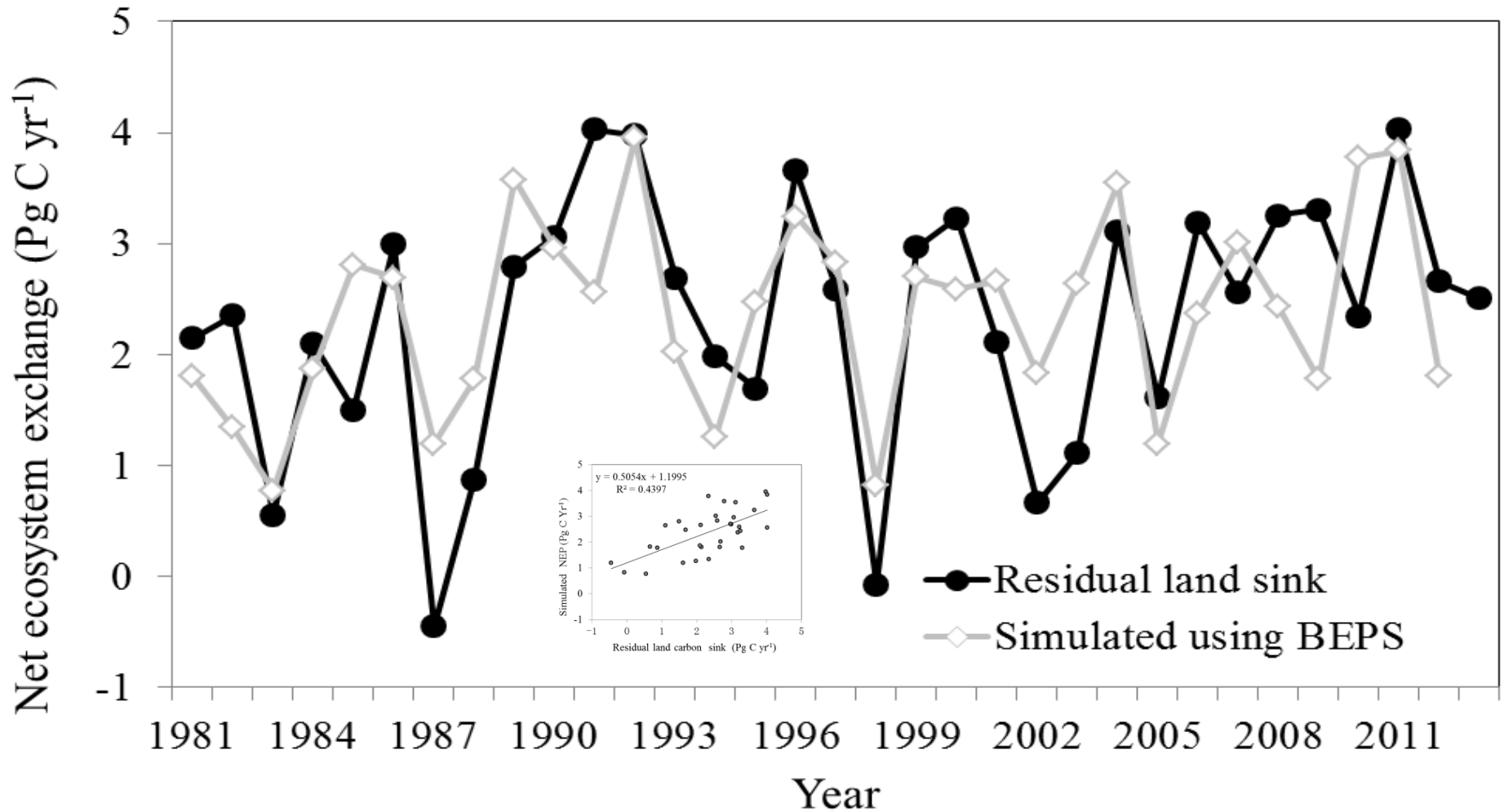
He, L., J. M. Chen, J. Pisek, C. B. Schaaf, A. H. Strahler. 2012. Global clumping index map derived from the MODIS BRDF product. *Remote Sensing of Environment*, 119, 118–130.

Spatial Distribution of GPP Averaged over 2000-2008

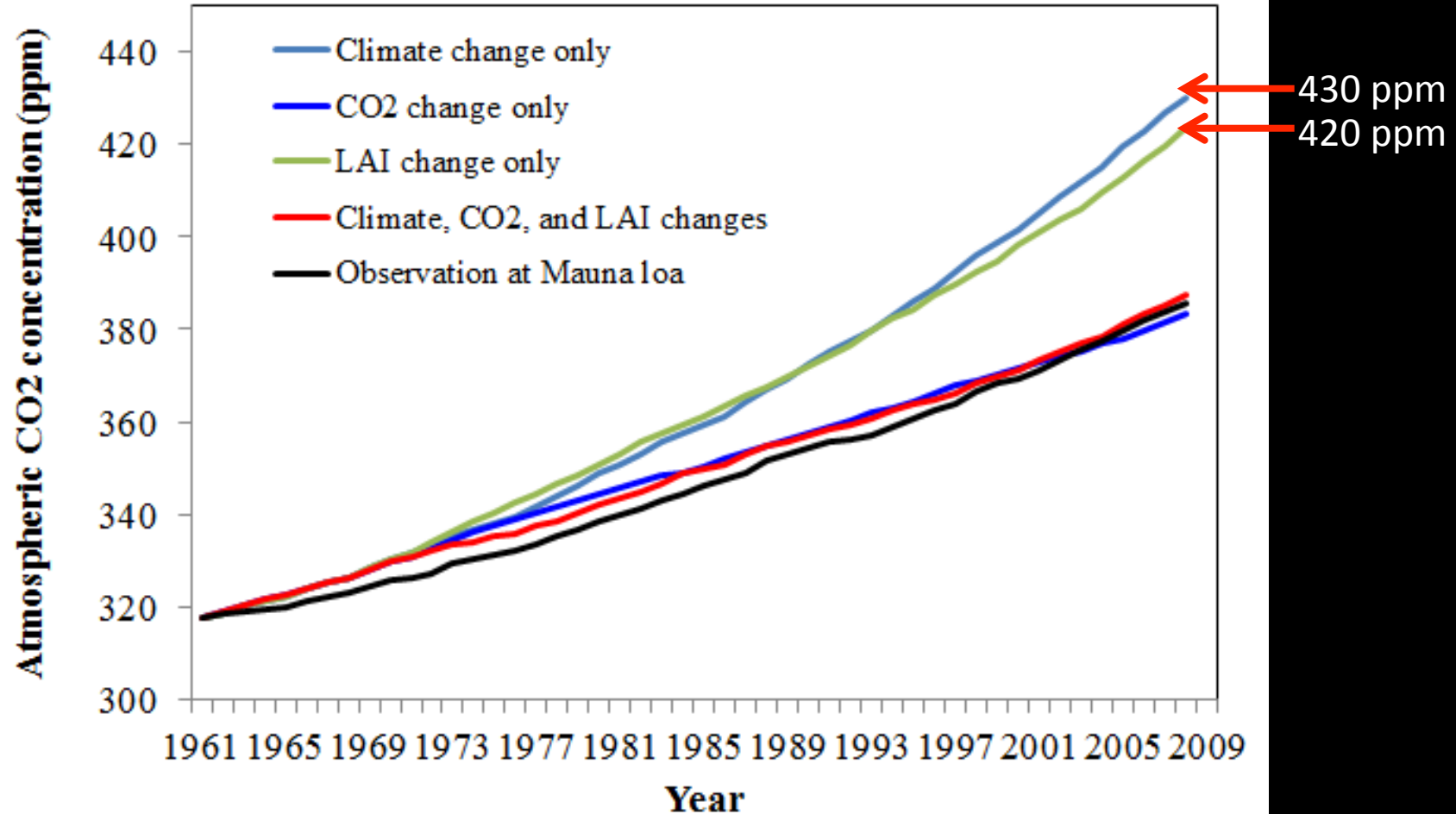


Chen, J. M., G. Mo, J. Pisek, F. Deng, M. Ishozawa, D. Chan, 2012. Effects of foliage clumping on global terrestrial gross primary productivity. *Global Biogeochemical Cycles*, VOL. 26, GB1019, 18 PP., doi:10.1029/2010GB003996.

Comparison of Modelled NEP with the Residual Land Sink from Global Carbon Project Office



Atmospheric CO₂ Concentration Affected by the Various Factors



$$\text{CO}_2 = E_{\text{FF}} + E_{\text{LUC}} - (S_{\text{ocean}} + S_{\text{land}})$$

So far we only used structural parameters in the global terrestrial carbon cycle modeling.

Can we do more with remote sensing data?

A Major Bottleneck in Global Ecology

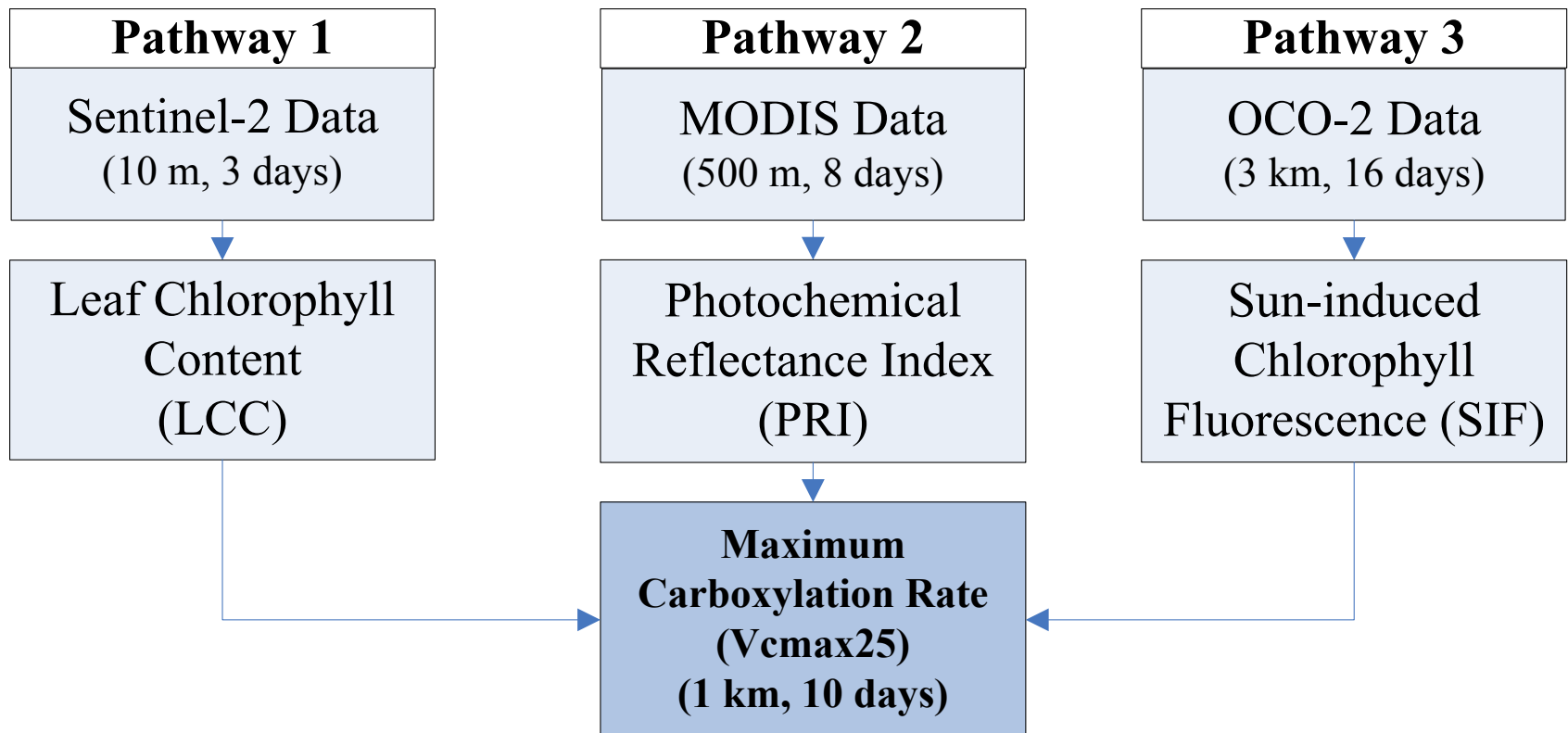
- V_{cmax} —a key parameter in carbon modelling.
- Large variation even within the same PFT and hard to obtain field measurements
- Seasonal variation

PFT	$n_{N_{a,nat}}$	$N_{a,nat}$					V_{max}^{25}					BQ	NUE			
		Mean	SD	SE	Sk	Ku	Mean	SD	SE	Sk	Ku		Mean	SE	Sk	Ku
1 Tropical trees (oxisols)	371	2.17	0.80	0.04	0.66	0.30	29.0	7.7	0.4	0.61	0.56	*62	14.02	2.26	1.72	4.72
2 Tropical trees (nonoxisols)	107	1.41	0.56	0.05	1.76	5.41	41.0	15.1	1.5	1.88	6.45	**94	29.60	2.54	0.54	2.45
3 Temperate broadleaved. evergreen trees	65	1.87	0.93	0.11	0.88	0.14	61.4	27.7	3.4	0.89	0.18	41	33.75	2.32	1.4	3.00
4 Temperate broadleaved deciduous trees	404	1.74	0.71	0.04	0.77	0.78	57.7	21.2	1.1	0.78	0.83	35	33.79	2.37	2.94	14.93
5 Evergreen coniferous trees	220	3.10	1.35	0.09	0.74	1.38	62.5	24.7	1.7	0.77	1.53	29	20.72	1.78	1.38	3.93
6 Deciduous coniferous trees	27	1.81	0.64	0.12	1.08	0.49	39.1	11.7	2.3	1.08	0.61	53	22.05	1.61	0.53	0.61
7 Evergreen shrubs	130	2.03	1.05	0.09	1.60	2.65	61.7	24.6	2.2	1.68	3.19	52	32.09	4.24	0.64	1.23
8 Deciduous shrubs	179	1.69	0.62	0.05	0.61	0.47	54.0	14.5	1.1	0.67	0.76	160	33.14	4.38	1.27	3.21
9 C3 herbaceous	254	1.75	0.76	0.05	1.42	2.94	78.2	31.1	2.0	1.44	3.10	42	45.29	2.57	1.79	8.83
10 C3 crops	***209	1.62	0.61	0.04	0.41	0.31	100.7	36.6	2.5	0.43	0.40	120	62.75	3.65	3.13	27.42

Kattge et al. (2009)

Only 67% of data fall in the range from 38.2 to 87.2

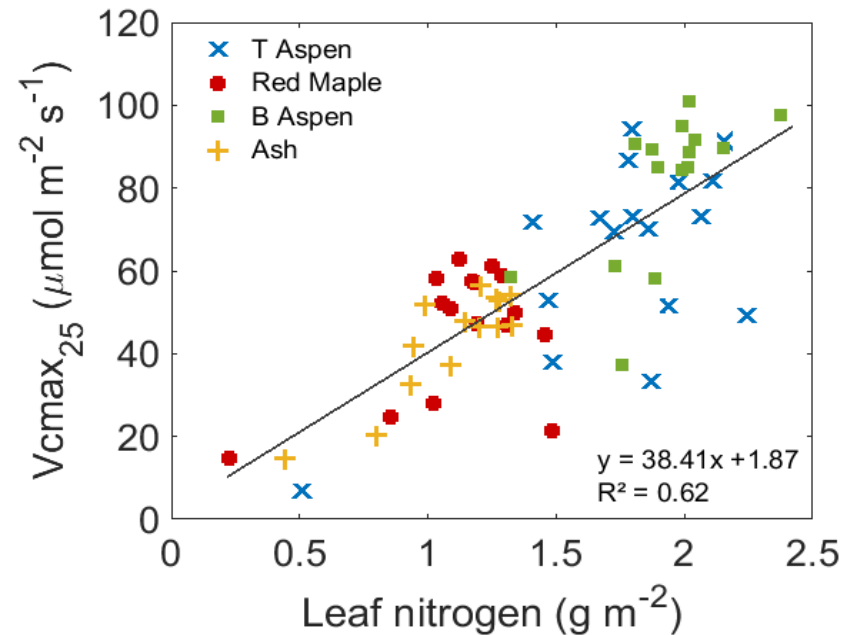
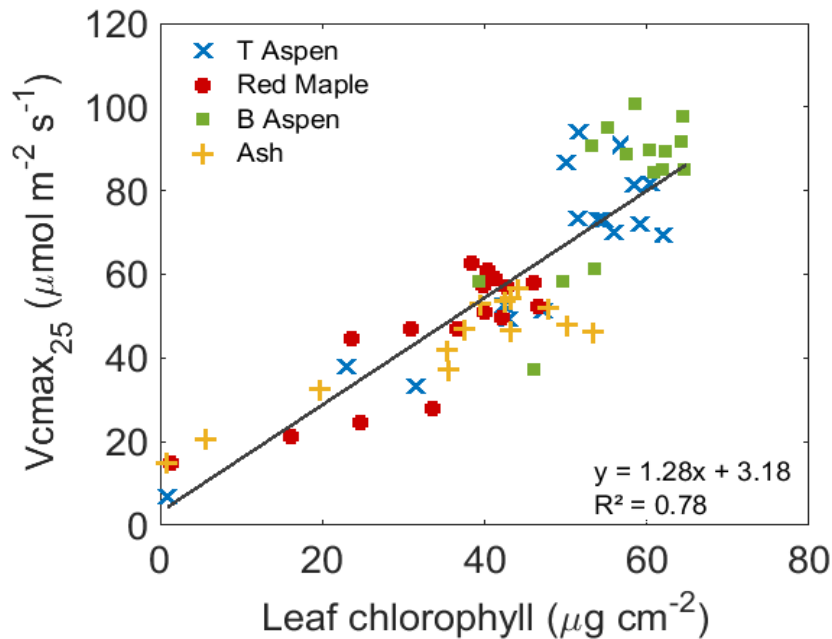
It may be possible to retrieve V_{cmax} using remote sensing data



Pathway 1

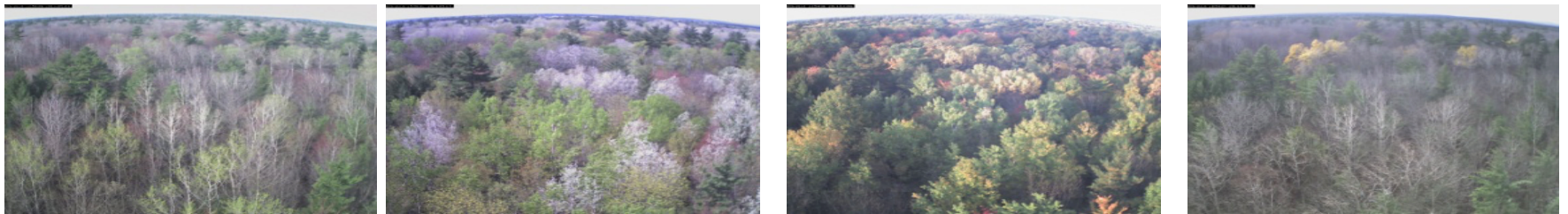
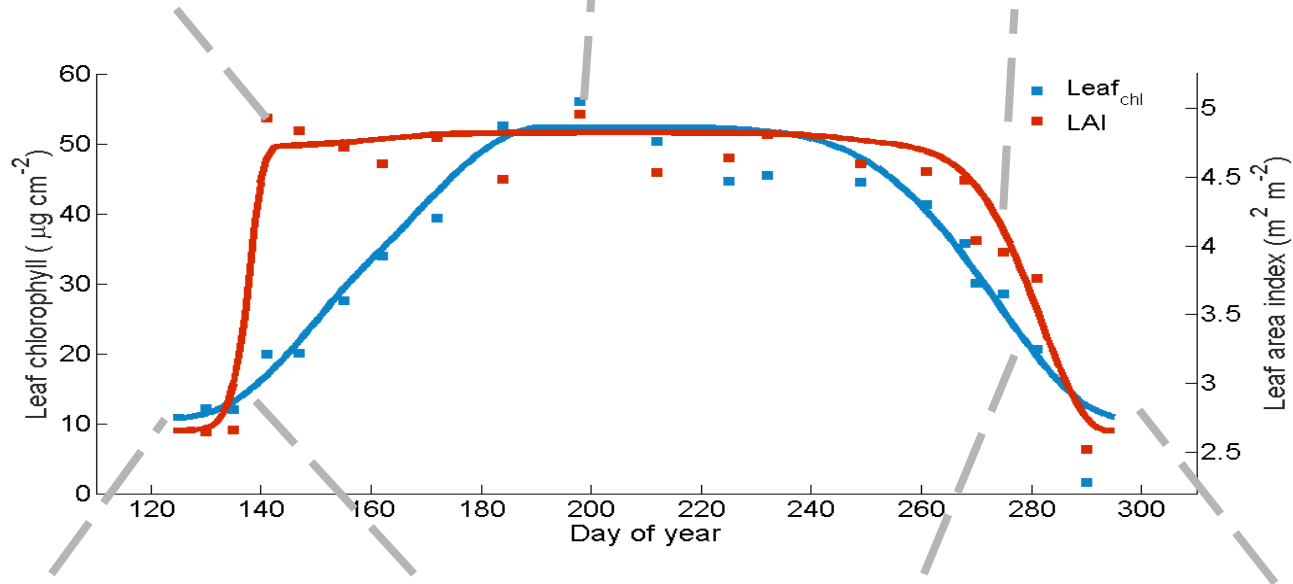
Retrieving V_{cmax25} via LCC

LCC-Vcmax25 relationship is better than nitrogen-Vcmax25 relationship

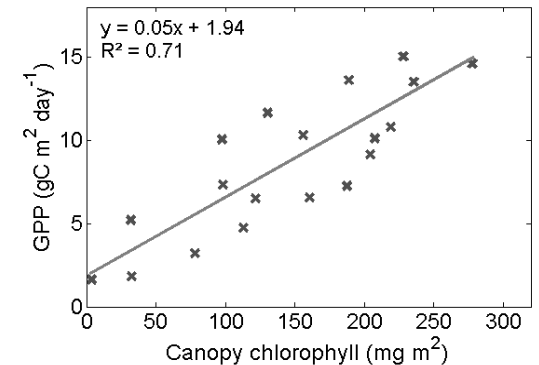
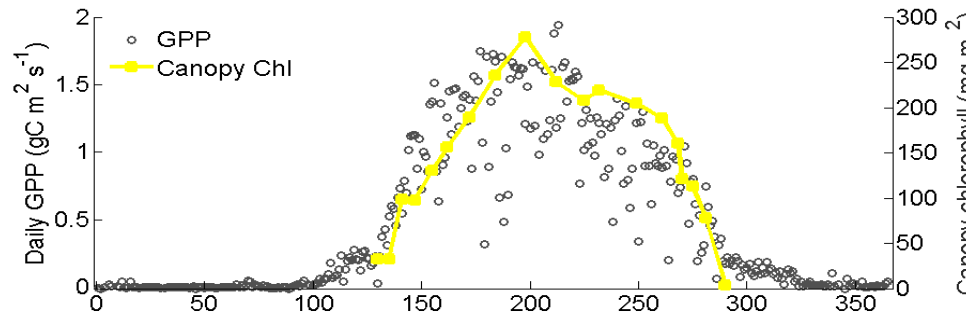
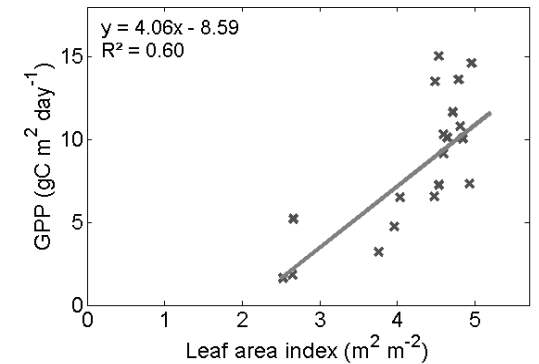
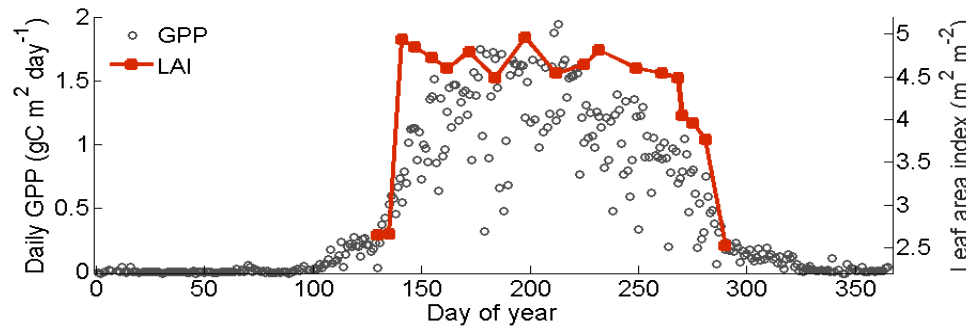
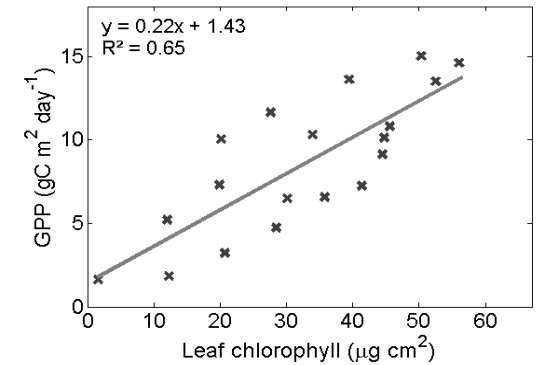
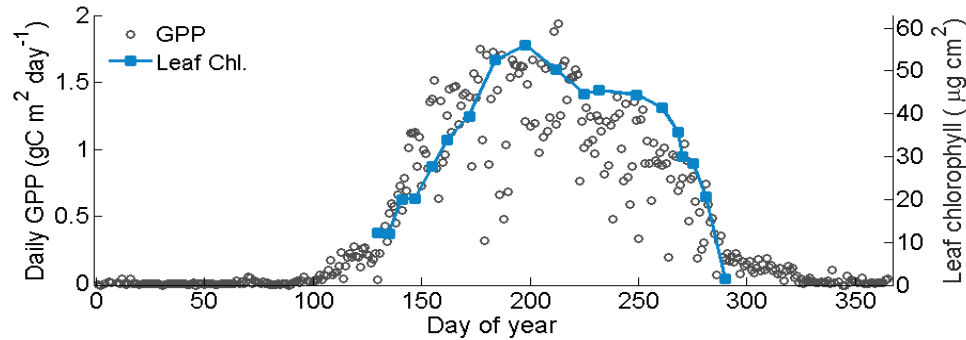


It is also far more reliable to retrieve LCC than leaf nitrogen from remote sensing data.

LAI and Leaf Chlorophyll Seasonal Dynamics Borden Forest Site, Ontario, 2013



Physiological impacts on carbon assimilation



Croft, Chen, et al. (2015, JGR-BGS)

An Airborne Multi-angle RS Field Campaign

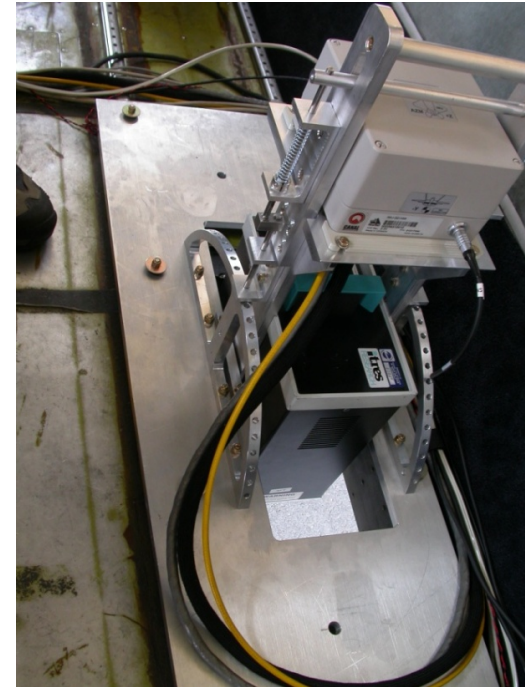
For Validating a Chlorophyll Retrieval Algorithm, Sudbury, Ontario, 2007



Compact Airborne Spectral Imager (CASI)

operated by John Miller

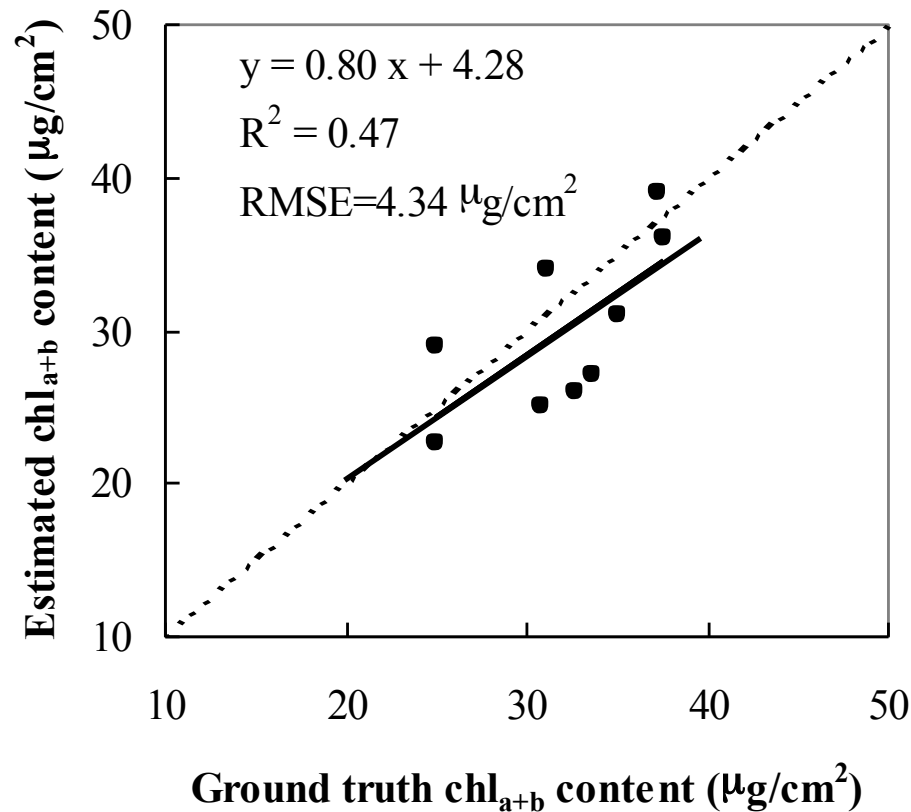
York University



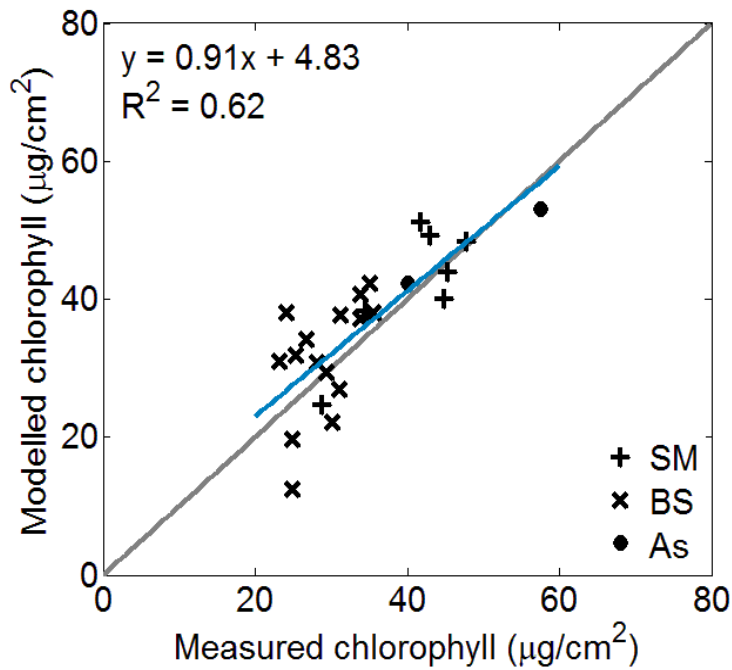
CASI – push-broom scanner

- operated in hyperspectral mode (7.5 nm bandwidth)
- 2 m spatial resolution
- Bands aggregated to simulate
- MISR-like red and NIR bands

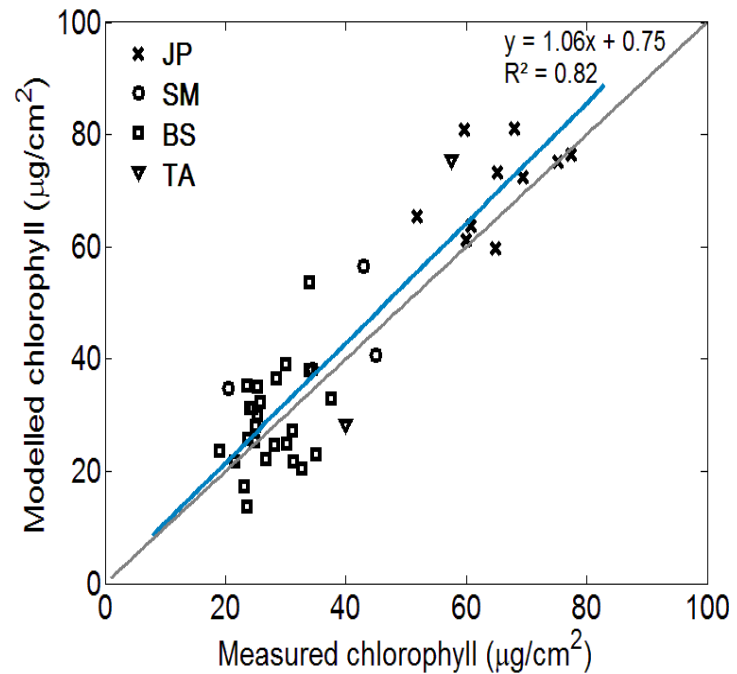
Validation of Retrieved Chlorophyll Content Per Unit Leaf Area Using CASI Data



Validation of Retrieved Chlorophyll Content Per Unit Leaf Area Using Satellite Data



MERIS

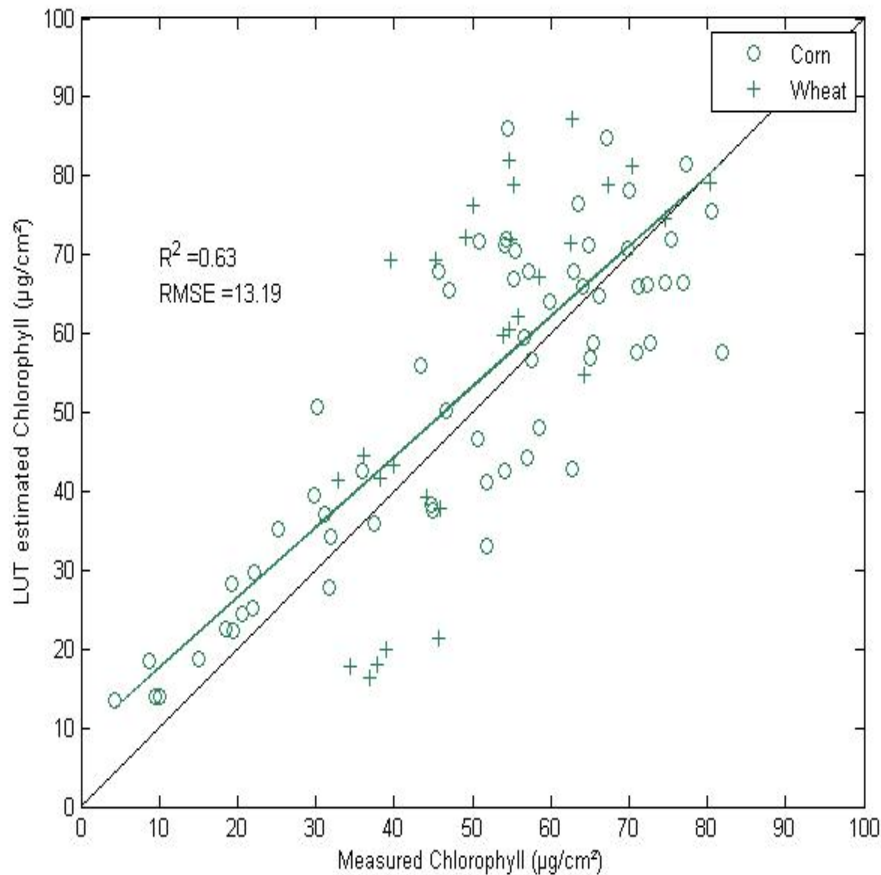


Landsat

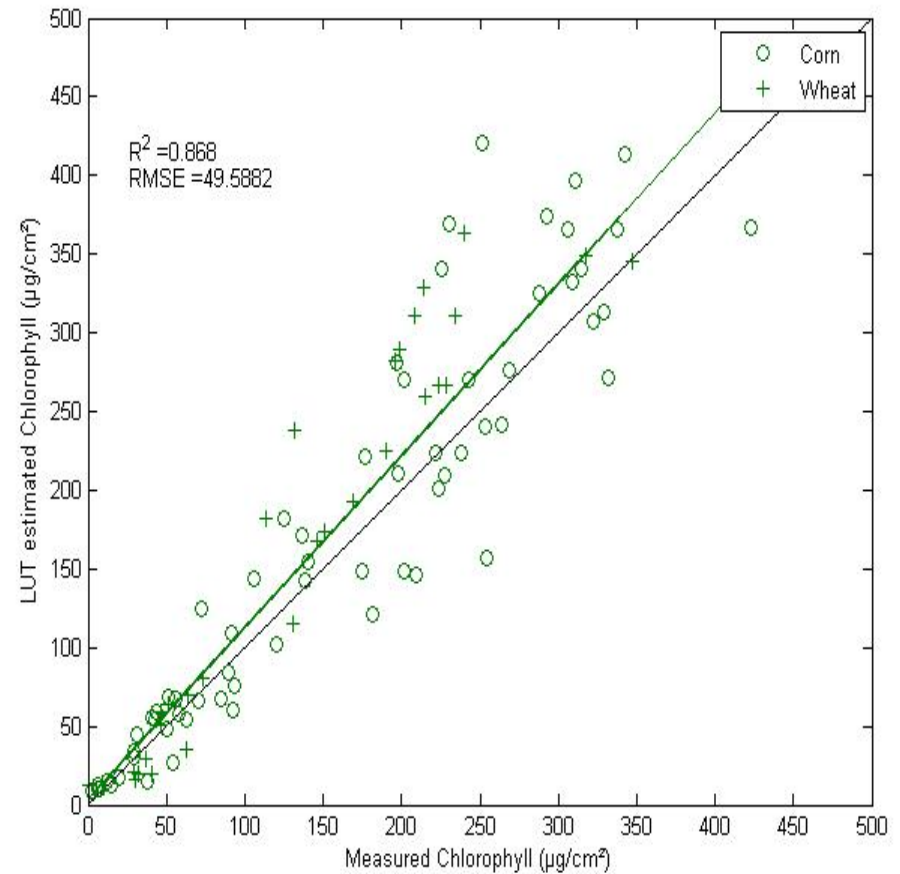
Validation of the Algorithm for Crop Sites

Corn and Wheat, Stratford, Ontario, 2014, Landsat

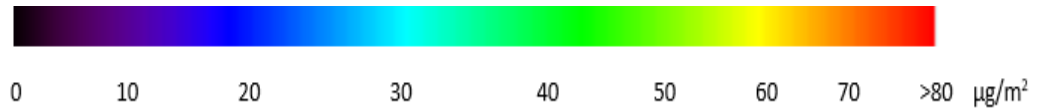
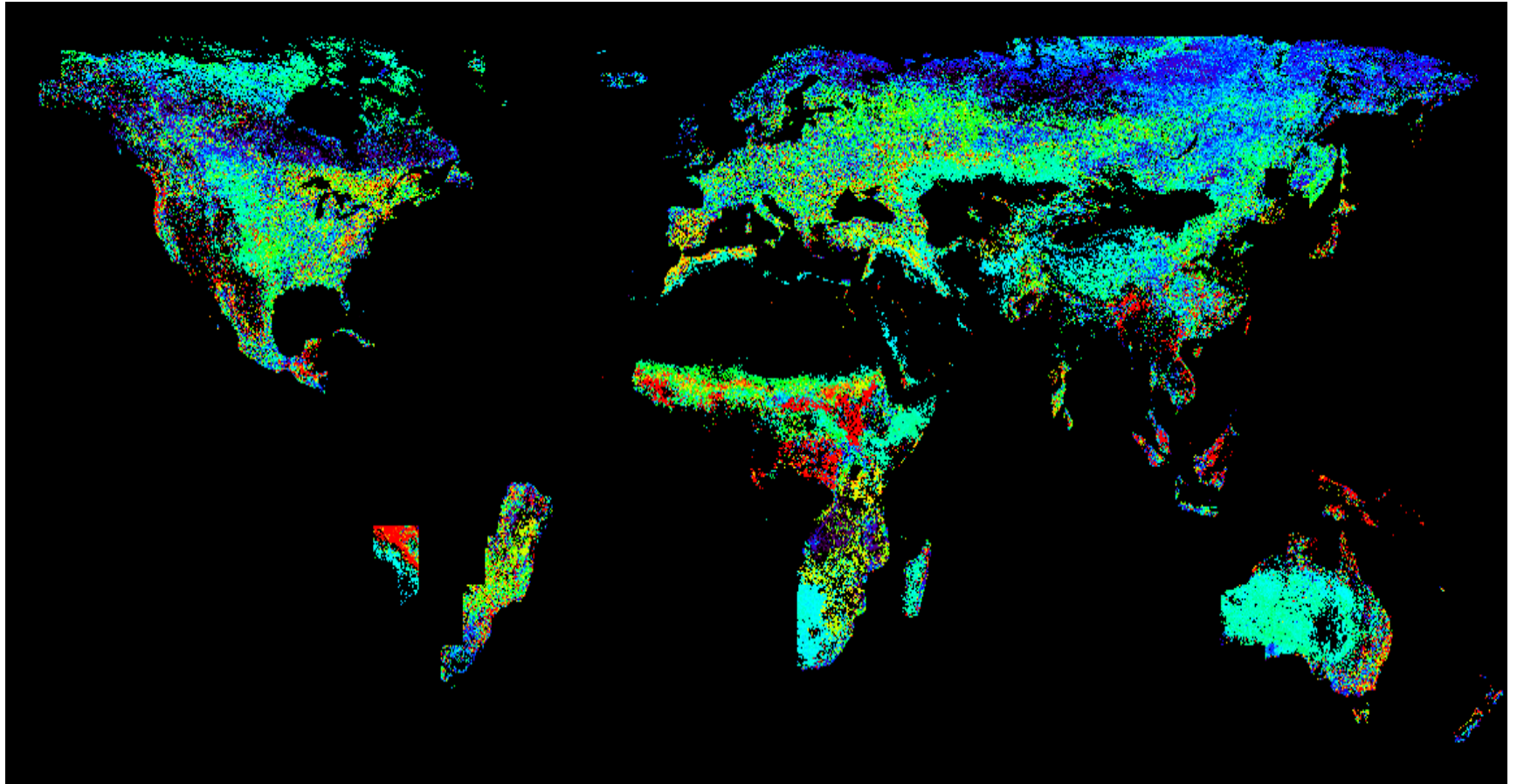
Leaf Level Chlorophyll



Canopy Level Chlorophyll

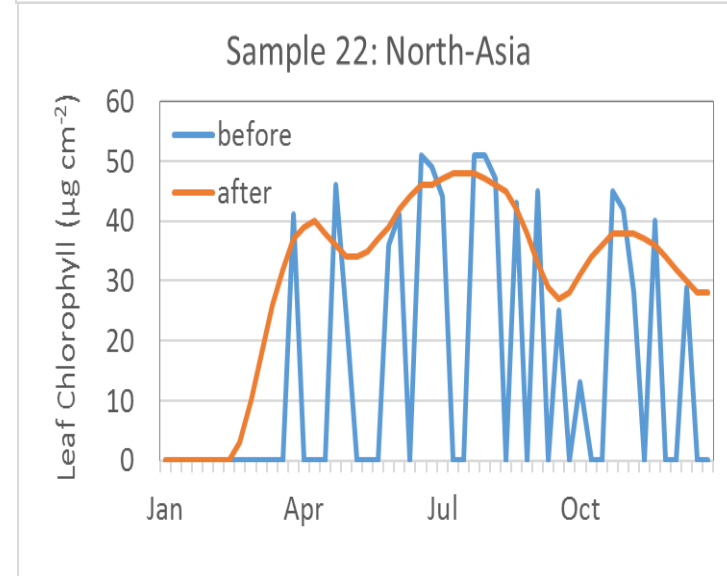
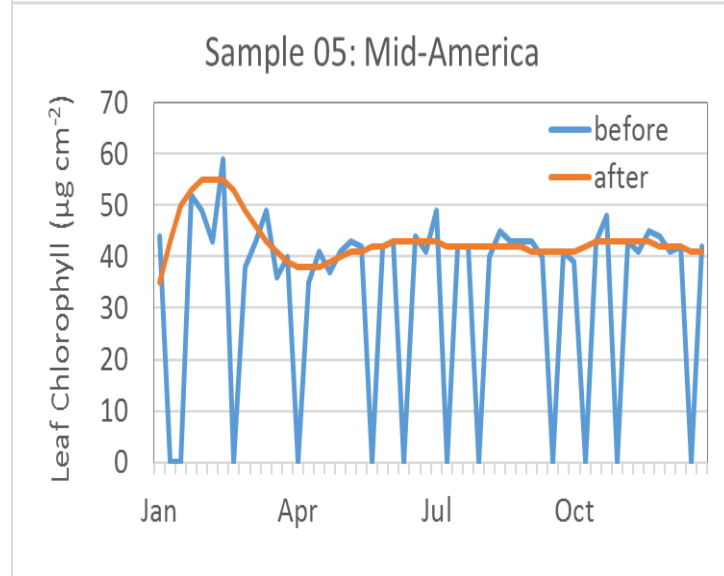
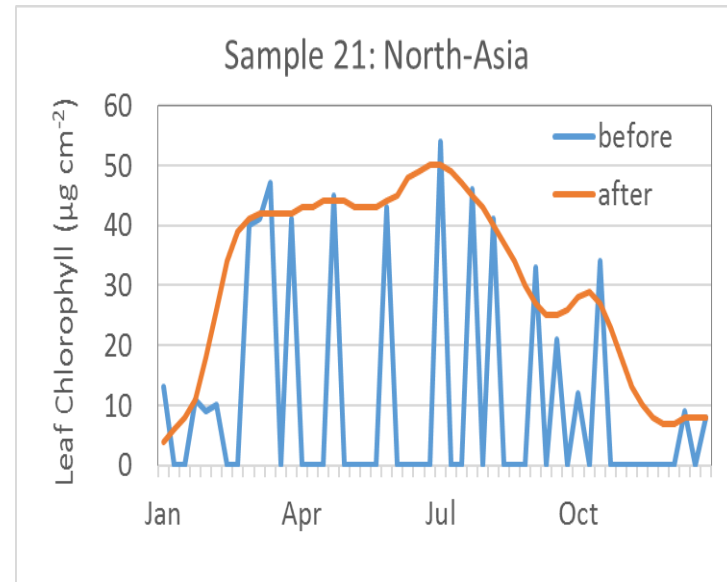
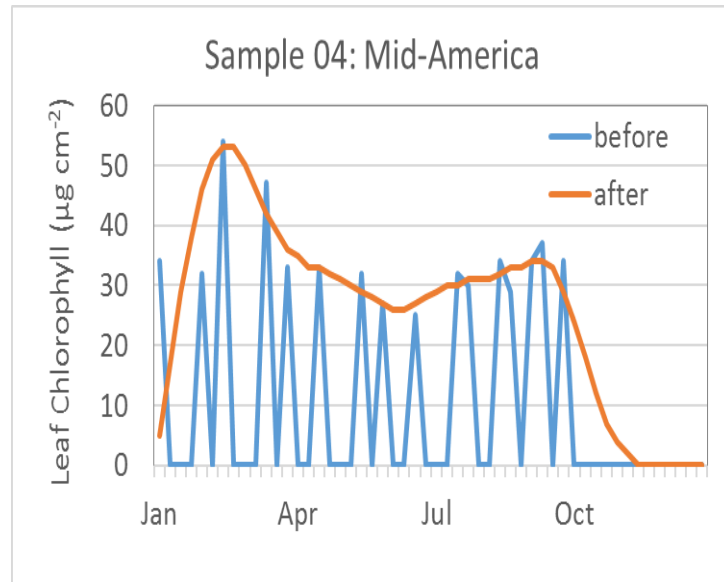


Chlorophyll Content Per Unit Leaf Area August 2012, 300 m resolution, MERIS data



Croft, Chen, et al. (in preparation)

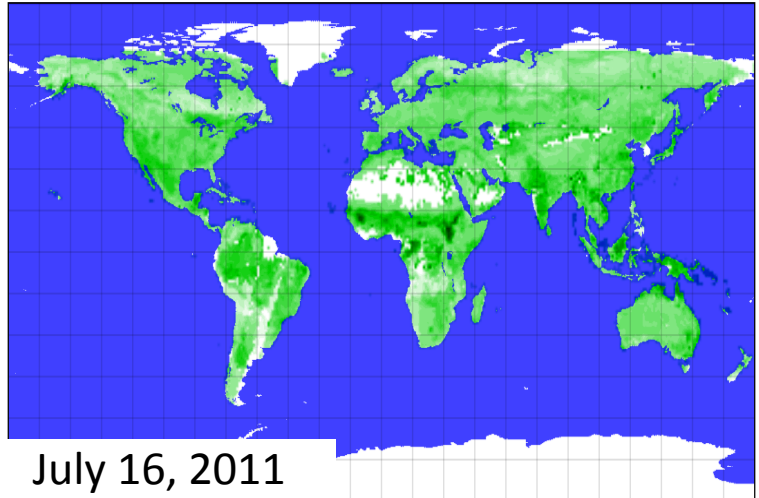
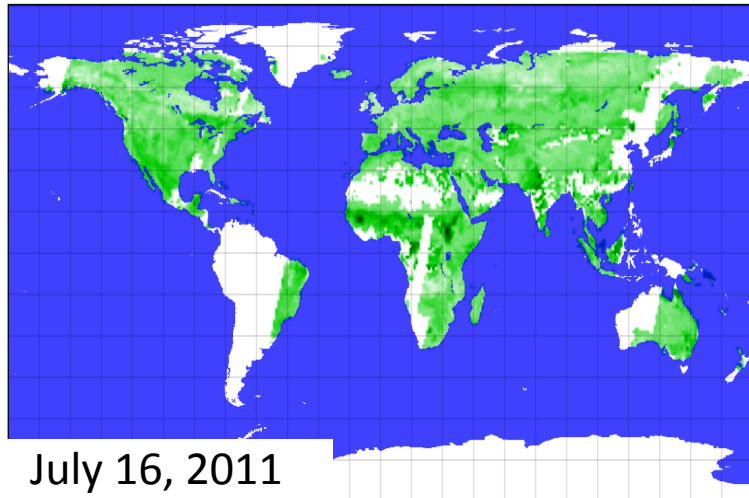
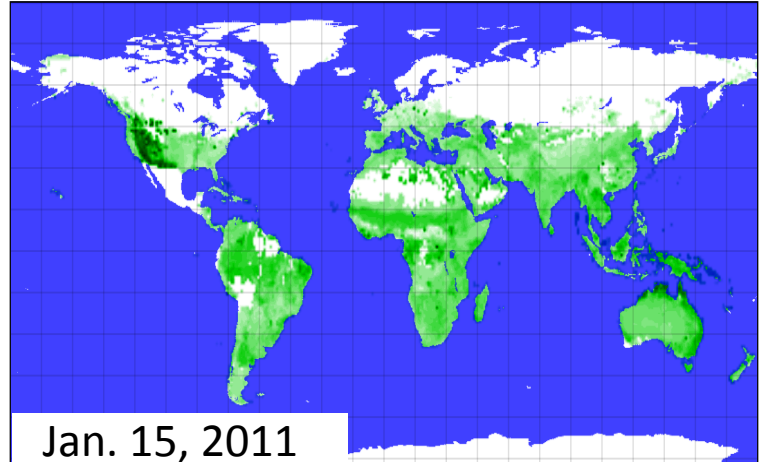
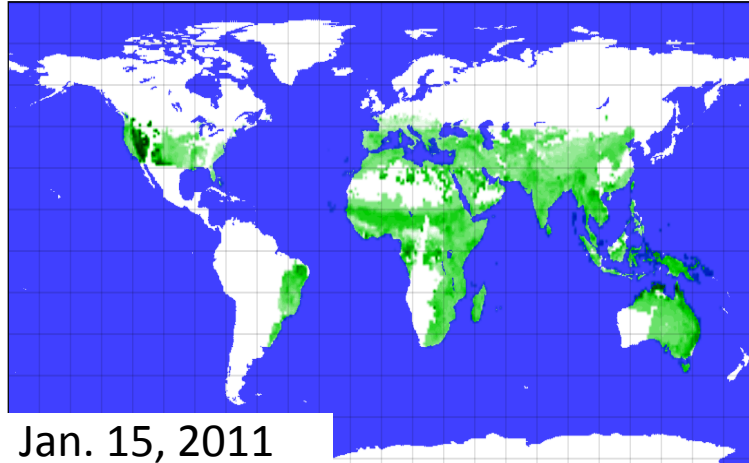
Samples of LCC trajectories before and after smoothing



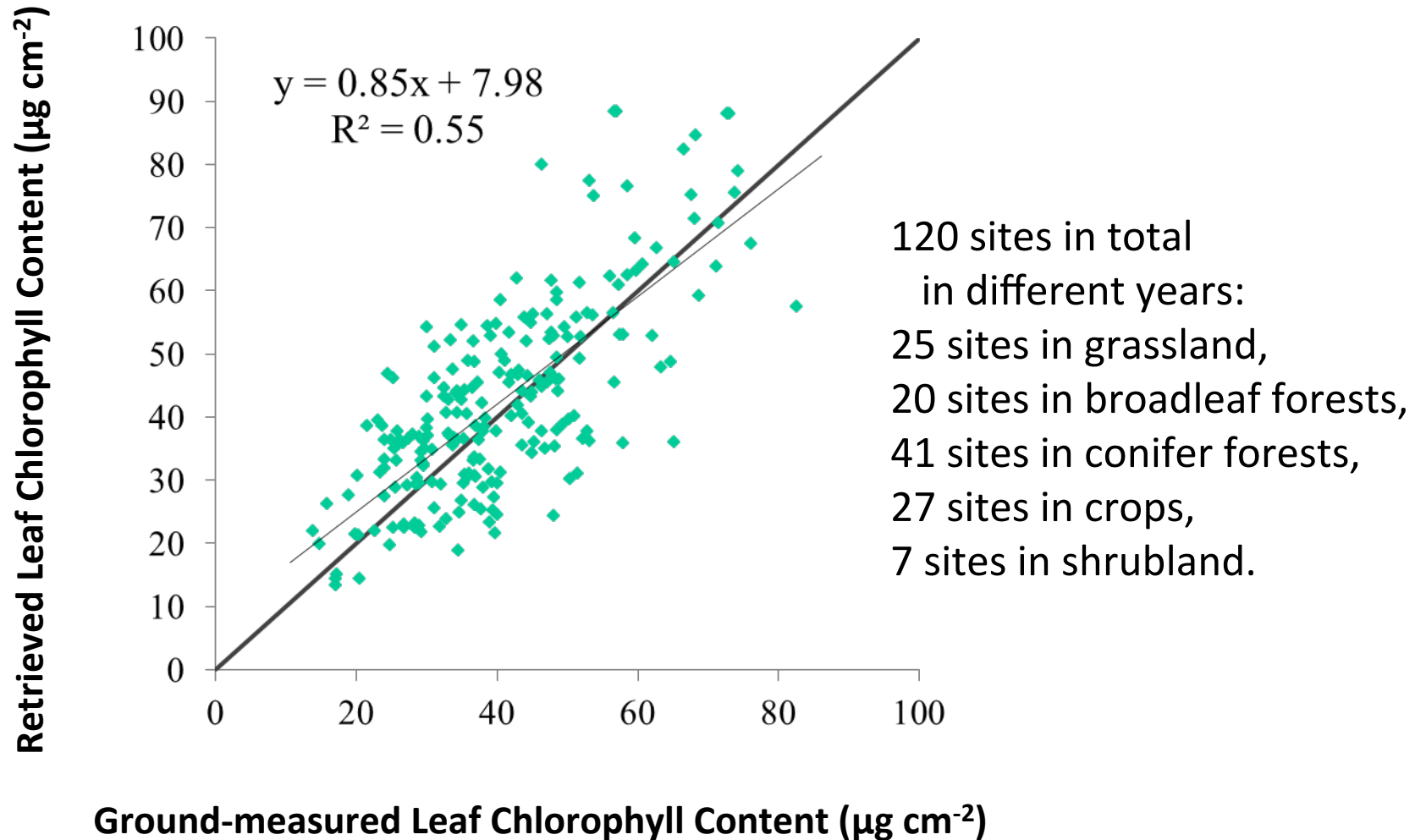
Leaf Chlorophyll Content Maps

Before Smoothing

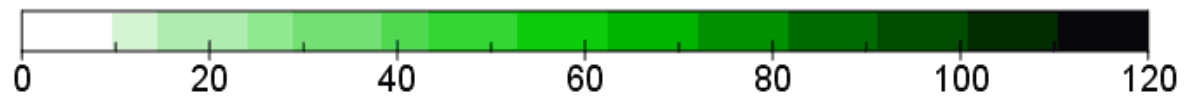
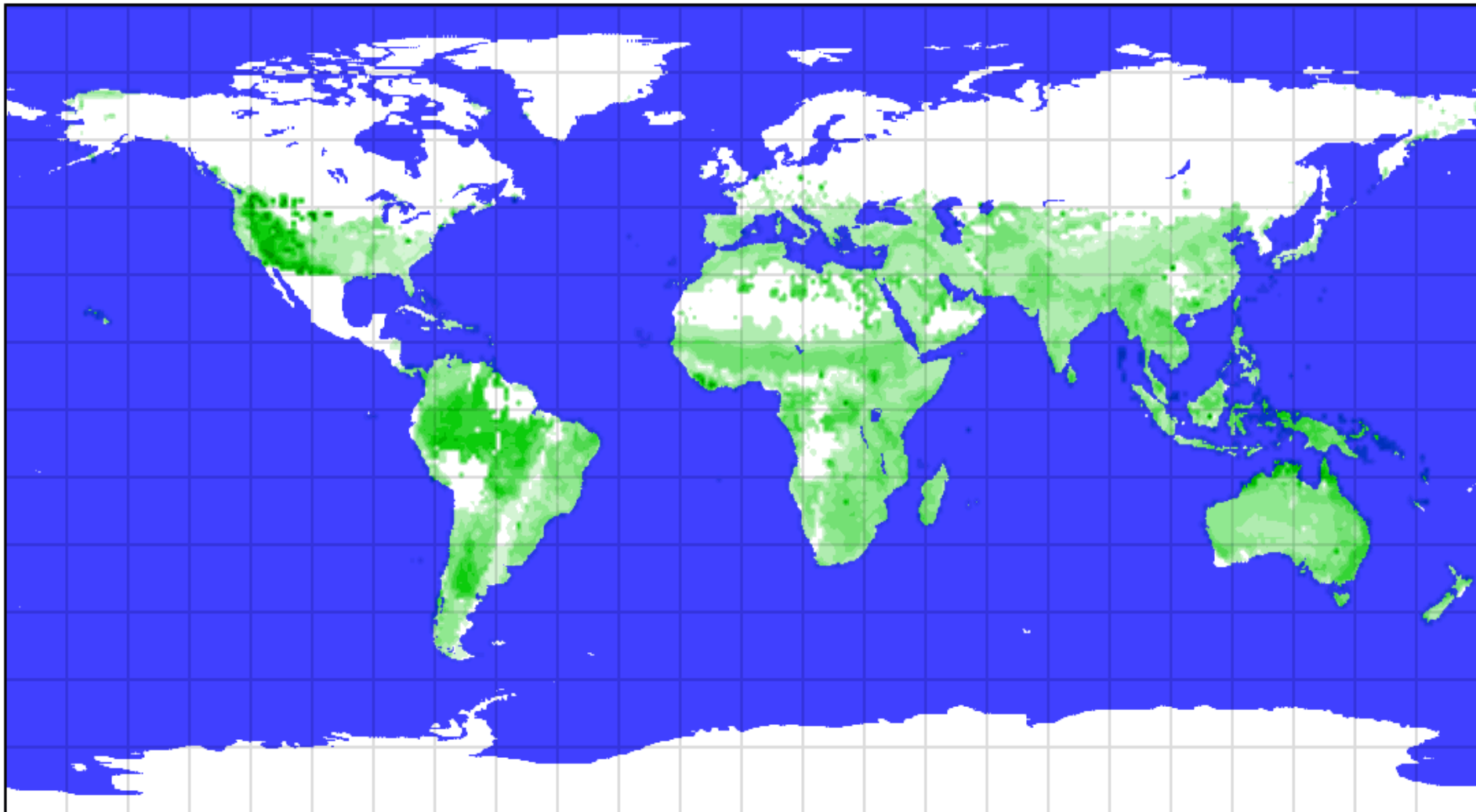
After Smoothing ¹⁵⁾



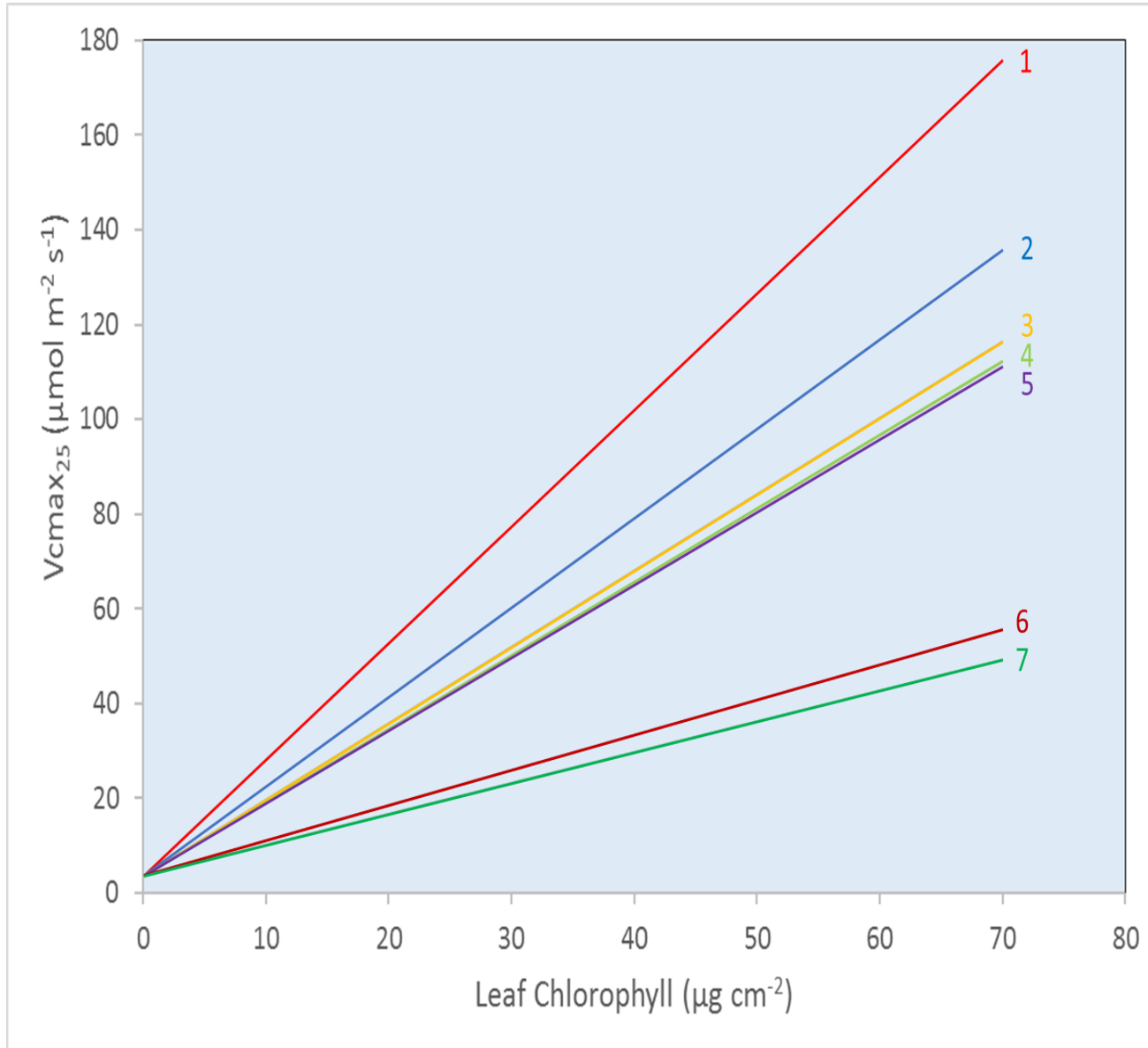
Validation Using Ground Data



Chlorophyll after smoothing (20110101)



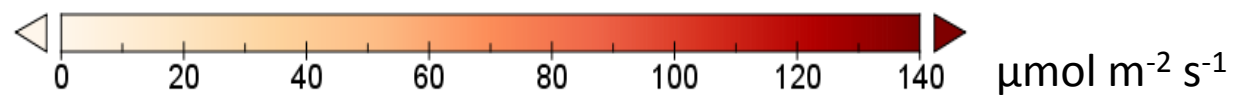
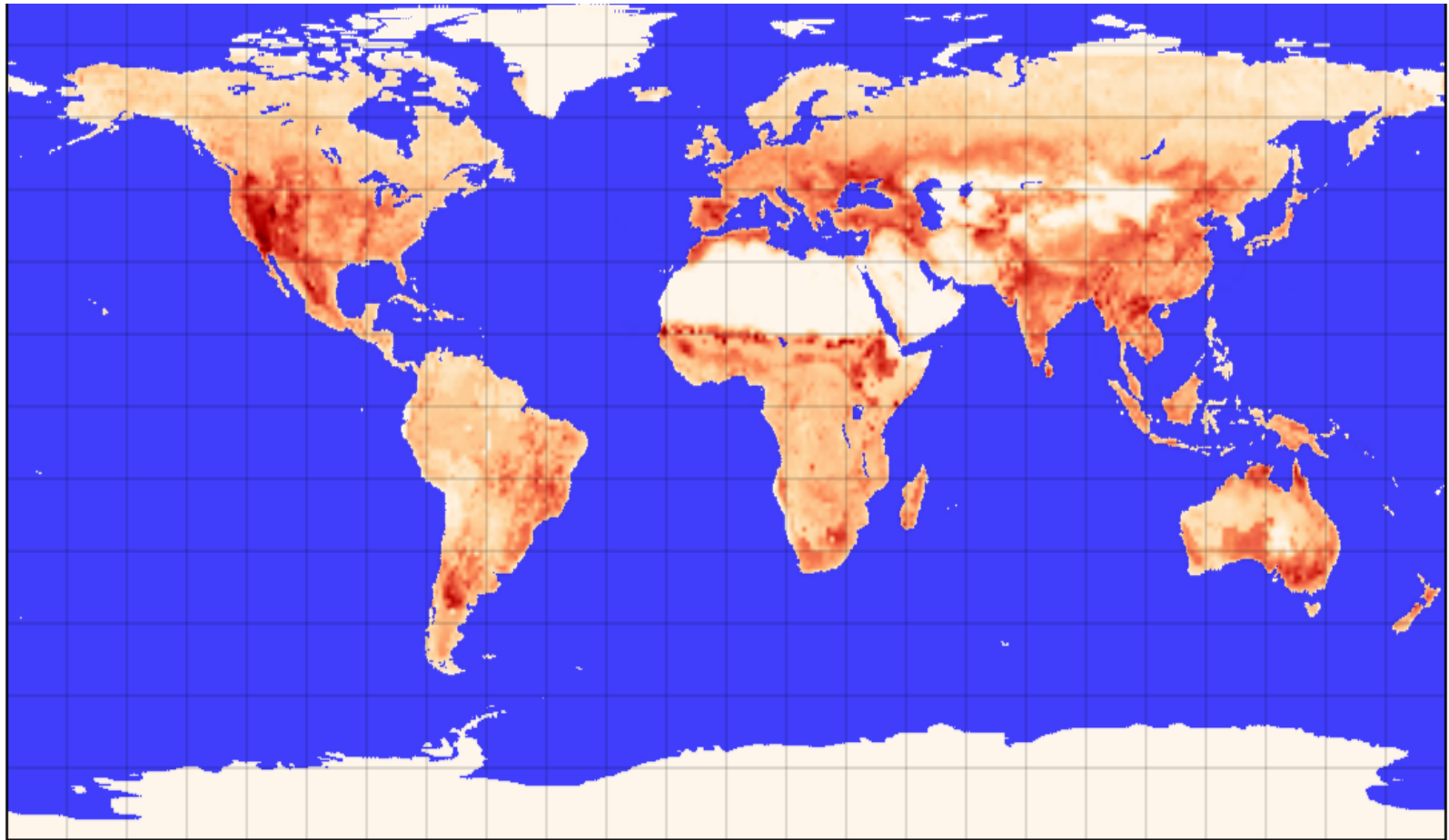
Relationship of $V_{cmax_{25}}$ and Chlorophyll for each PFT



- 1 Others
 $V_{cmax} = 2.46 \cdot chl + 3.72$
- 2 Evergreen Conifers
 $V_{cmax} = 1.88 \cdot chl + 3.72$
- 3 Deciduous Conifers
 $V_{cmax} = 1.61 \cdot chl + 3.72$
- 4 Broadleaf Deciduous
 $V_{cmax} = 1.55 \cdot chl + 3.72$
- 5 Shrub
 $V_{cmax} = 1.53 \cdot chl + 3.72$
- 6 C4 Plants
 $V_{cmax} = 0.74 \cdot chl + 3.72$
- 7 Broadleaf Evergreen
 $V_{cmax} = 0.65 \cdot chl + 3.72$

$V_{cmax_{25}}$ Derived from Chlorophyll

Annual Mean, 2011



Conclusion

- Flux towers are solid anchors for mapping regional carbon and other fluxes;
- The gaps between the anchor points are being effectively filled using remote sensing techniques which are not only useful for mapping structural parameters but also beginning to provide critical biological parameters directly related to the fluxes.