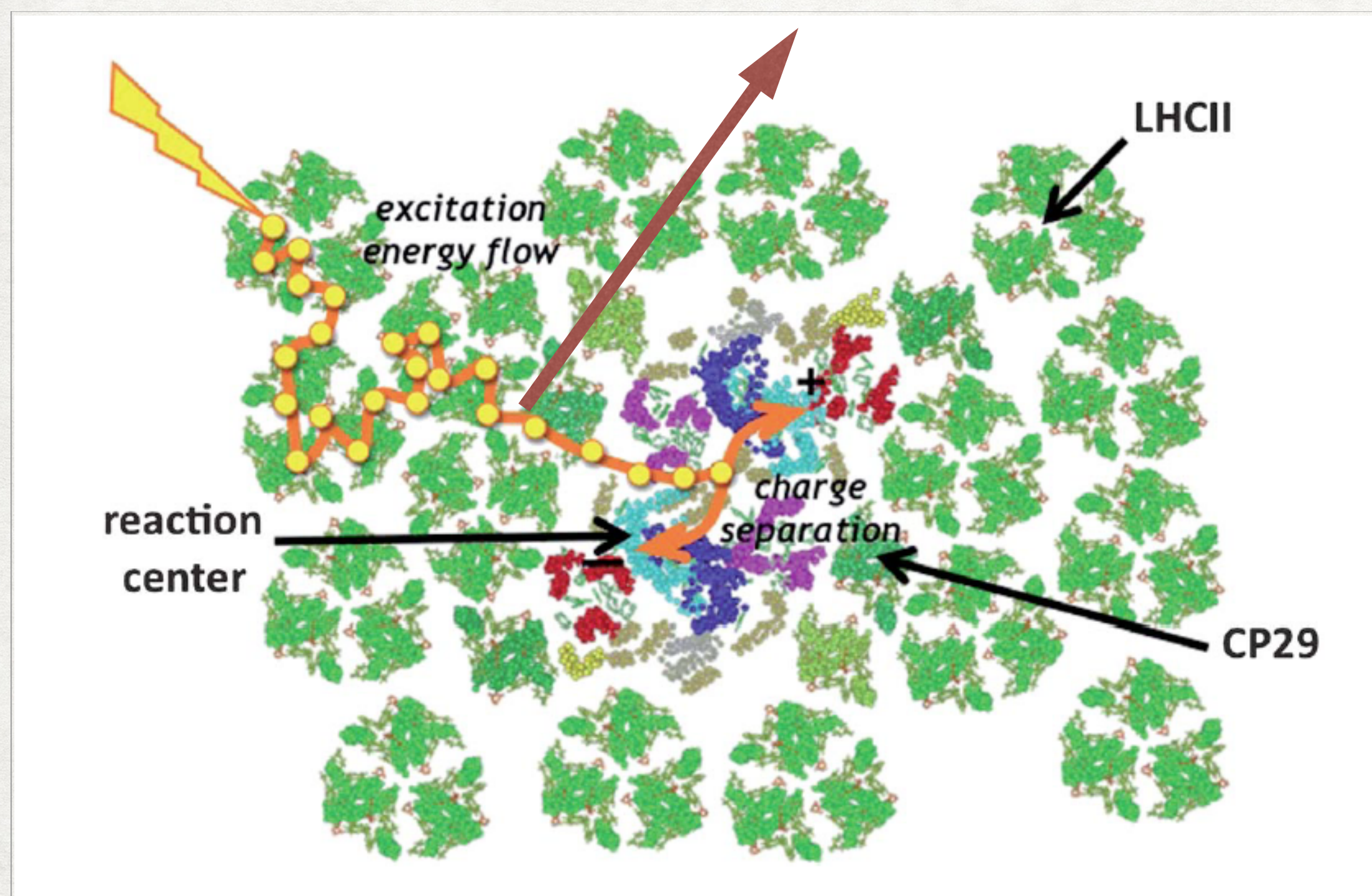
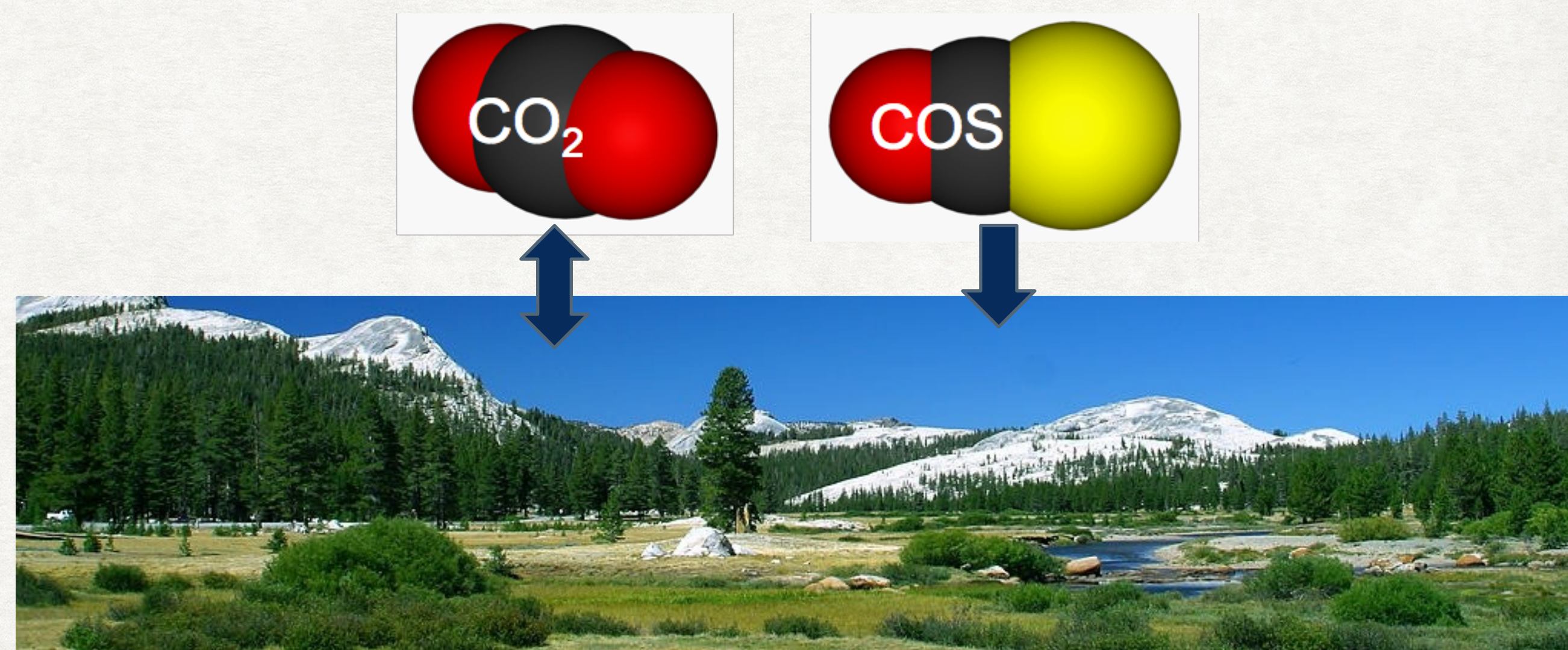


# NEW TOOLS FOR INVESTIGATING THE CARBON CYCLE: THE BACKGROUND

*Chlorophyll Fluorescence*



*Carbonyl Sulfide*



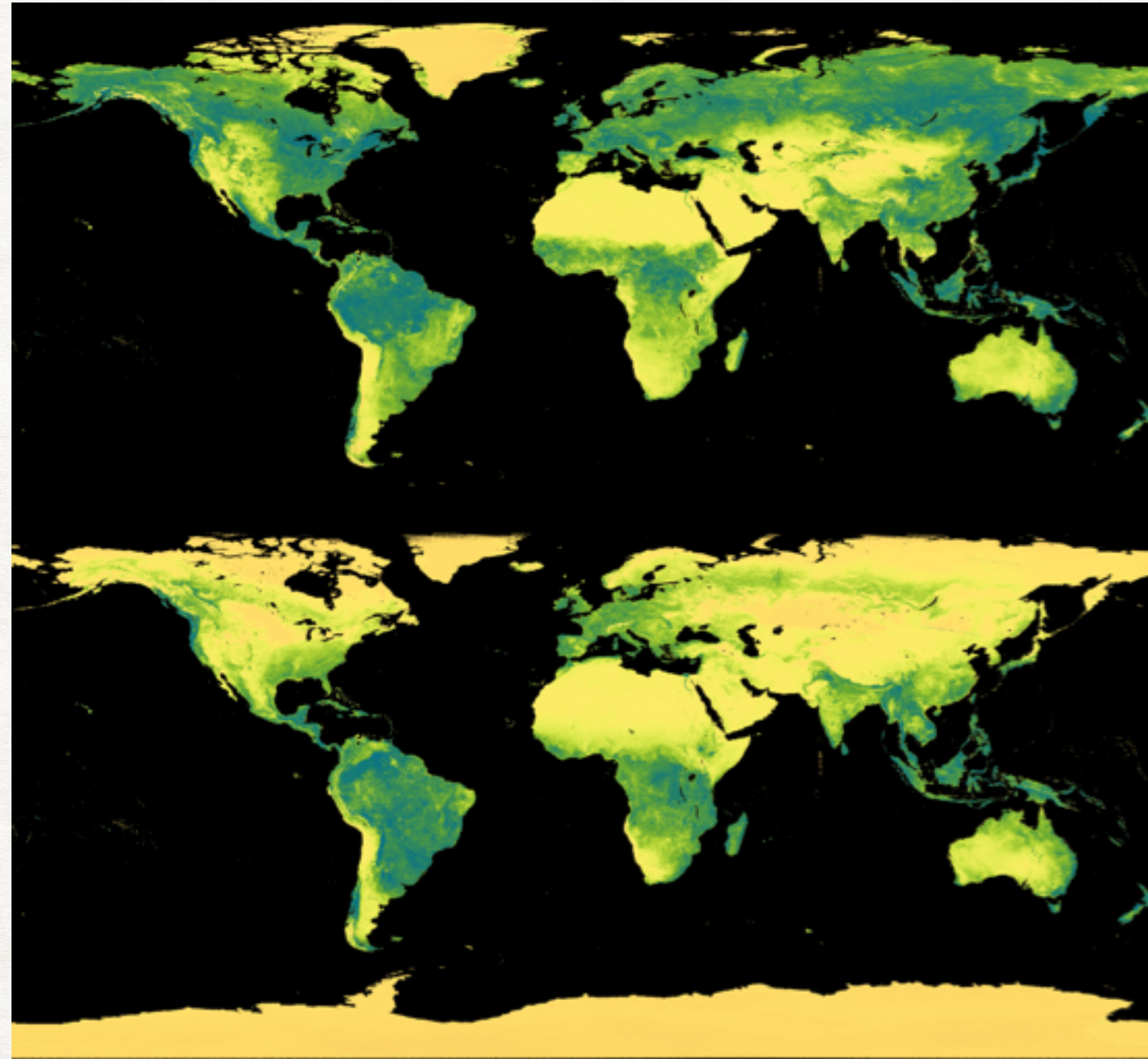
Next-Generation Approach for Detecting Climate-Carbon Feedbacks: Space-Based Integration of Carbonyl Sulfide (OCS),  $\text{CO}_2$ , and Solar Induced Fluorescence (SIF). Sept. 18, 2017

# Early steps: Remote Sensing

AVHRR  
and  
NDVI



Jim Tucker



Cover of Nature ca. 1986



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Inez Fung

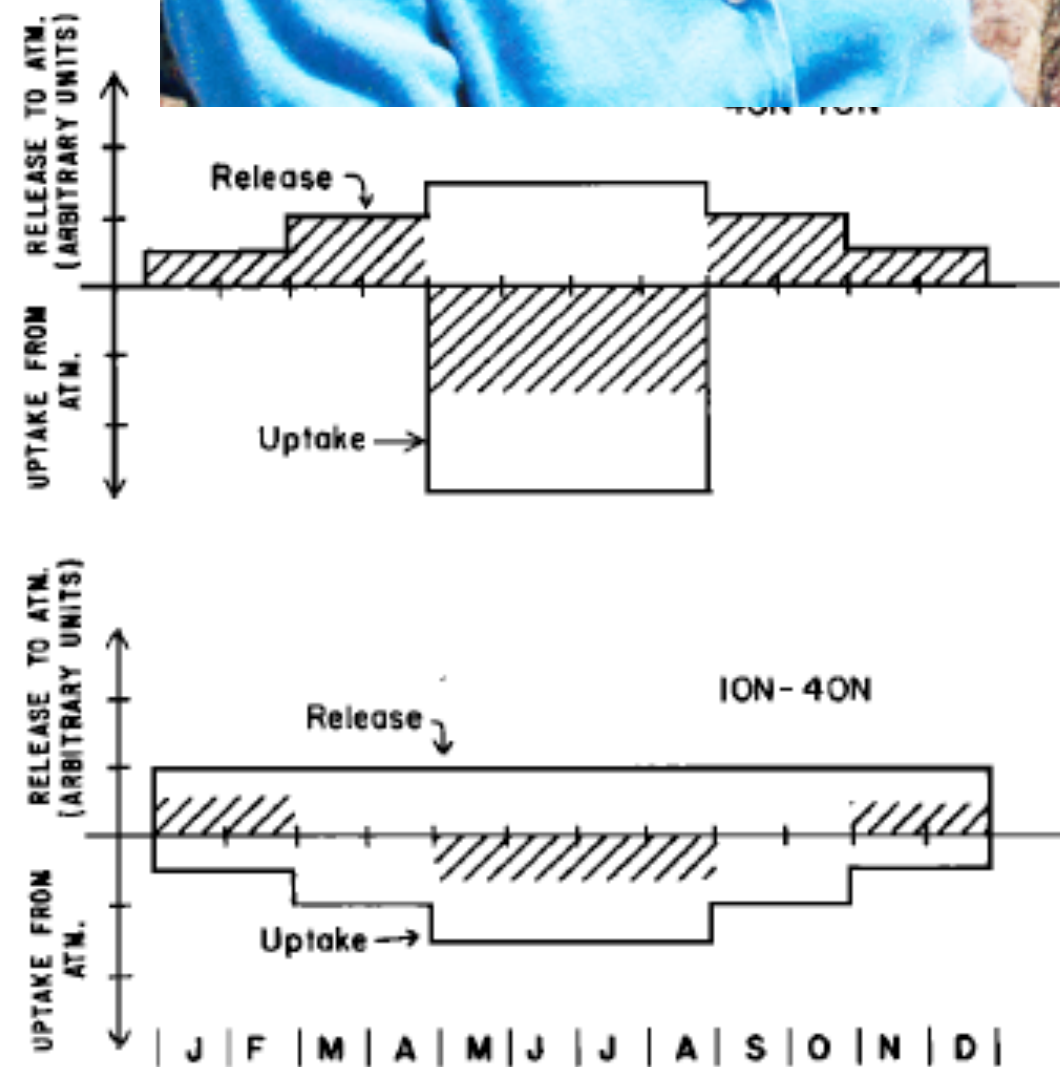


Fig. 3. Seasonality of biospheric uptake and release of CO<sub>2</sub> [after Azevedo, 1982] employed in experiment 3.

# Models of Atmospheric CO<sub>2</sub>

JOURNAL OF GEOPHYSICAL RESEARCH, VOL. 88, NO. C2, PAGES 1281-1294, FEBRUARY 20, 1983

## Three-Dimensional Tracer Model Study of Atmospheric CO<sub>2</sub>: Response to Seasonal Exchanges With the Terrestrial Biosphere

I. FUNG,<sup>1</sup> K. PRENTICE,<sup>2</sup> E. MATTHEWS,<sup>3</sup> J. LERNER,<sup>3</sup> AND G. RUSSELL

*Institute for Space Studies, NASA/Goddard Space Flight Center, New York, New York 10025*

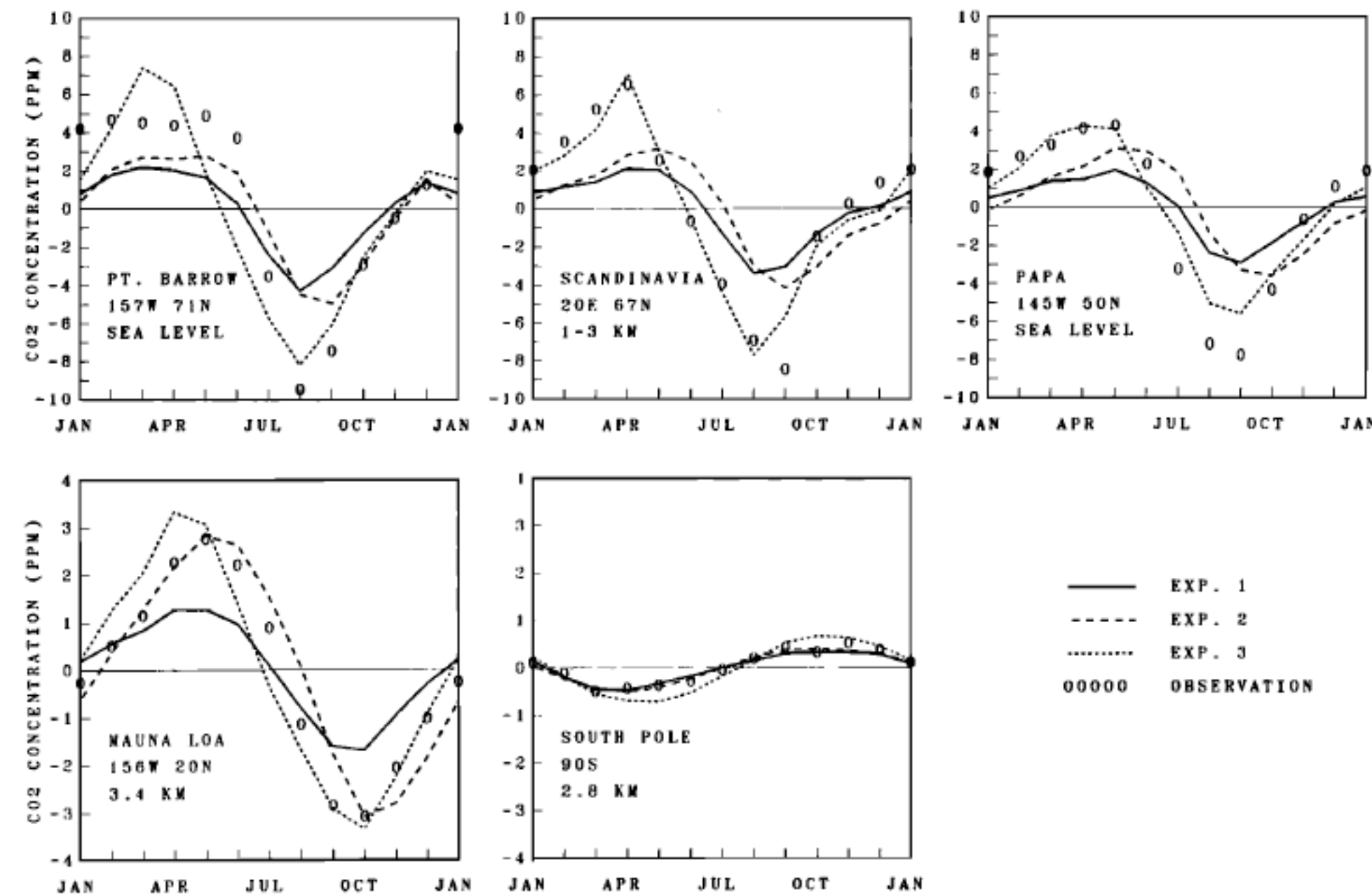


Fig. 4. Model simulated and observed annual cycles of CO<sub>2</sub> at five locations. Observations for Point Barrow, Papa, Mauna Loa, and the south pole are taken from Pearman and Hyson [1980] and that for Scandinavia from Bolin and Bischof [1970].



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# Integration Remote Sensing, Atmospheric Measurements and Models



The Flying Carpet Plots

NATURE VOL. 319 16 JANUARY 1986

ARTICLES

## Relationship between atmospheric CO<sub>2</sub> variations and a satellite-derived vegetation index

C. J. Tucker\*, I. Y. Fung†, C. D. Keeling‡ & R. H. Gammon§

\* NASA/Goddard Space Flight Center, Code 623, Greenbelt, Maryland 20771, USA

† NASA/Goddard Institute for Space Studies, New York, New York 10025, USA and Lamont-Doherty Geological Observatory of Columbia University, Palisades, New York, New York 10964, USA

‡ Scripps Institution of Oceanography, La Jolla, California 92093, USA

§ NOAA/GMCC, Boulder, Colorado 80302, USA

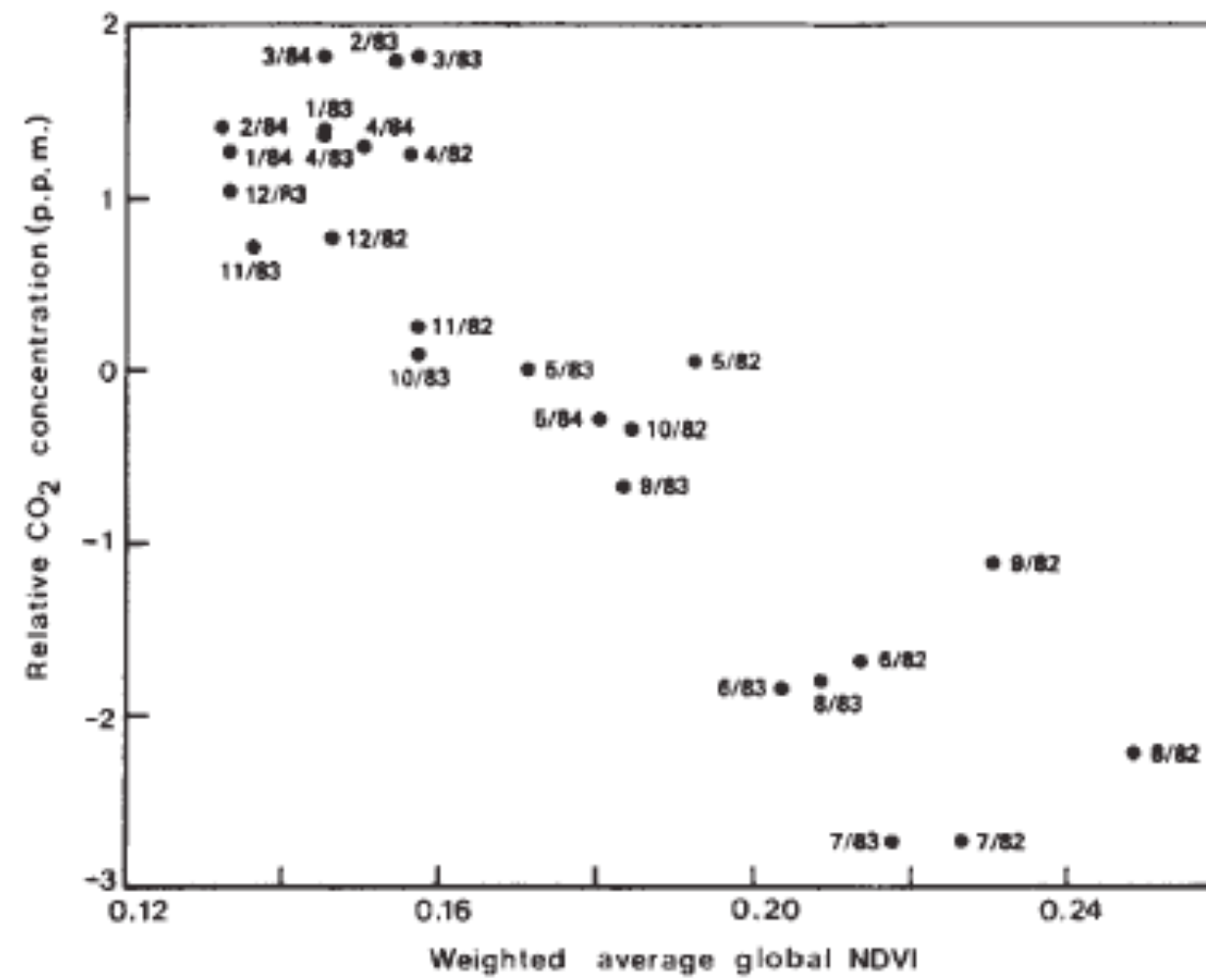


Fig. 4 The globally averaged atmospheric CO<sub>2</sub> concentration plotted against the globally averaged NDVI with a time lag of 1 month. The CO<sub>2</sub> data are from the global network of 20 NOAA/GMCC stations.

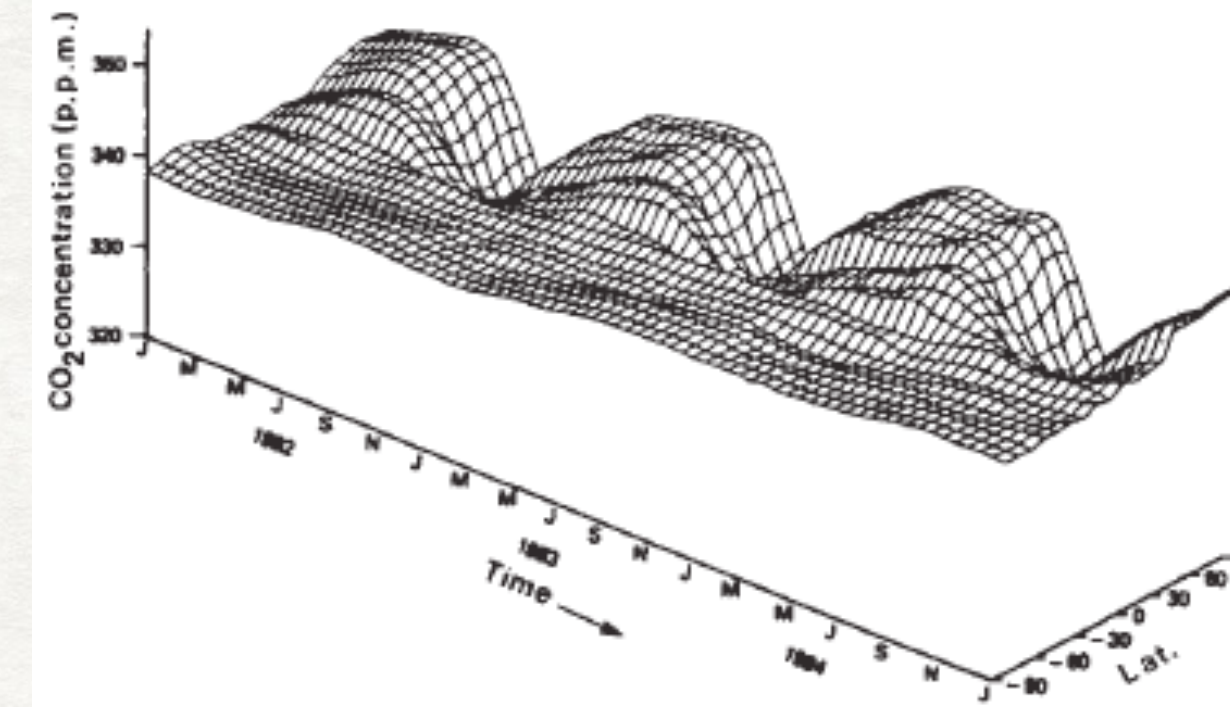
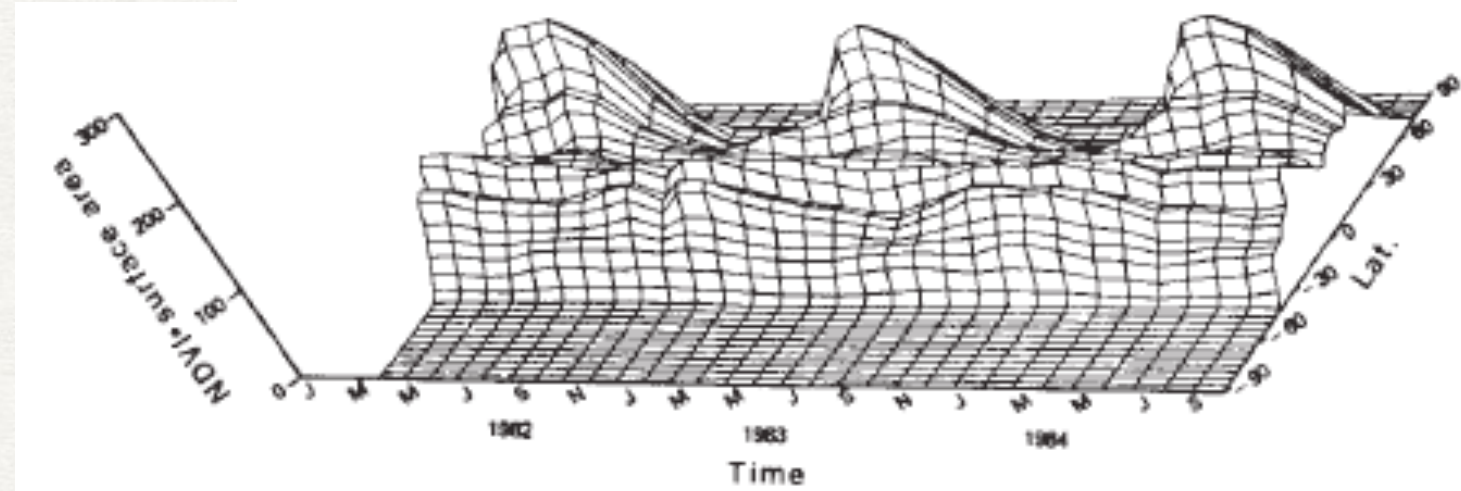


Fig. 1 Variation of global atmospheric CO<sub>2</sub> concentrations with latitude and time based on the NOAA/GMCC flask measurements for 1982-84.



# Including Biology in the Models

Piers Sellers



Canopy  
Conductance

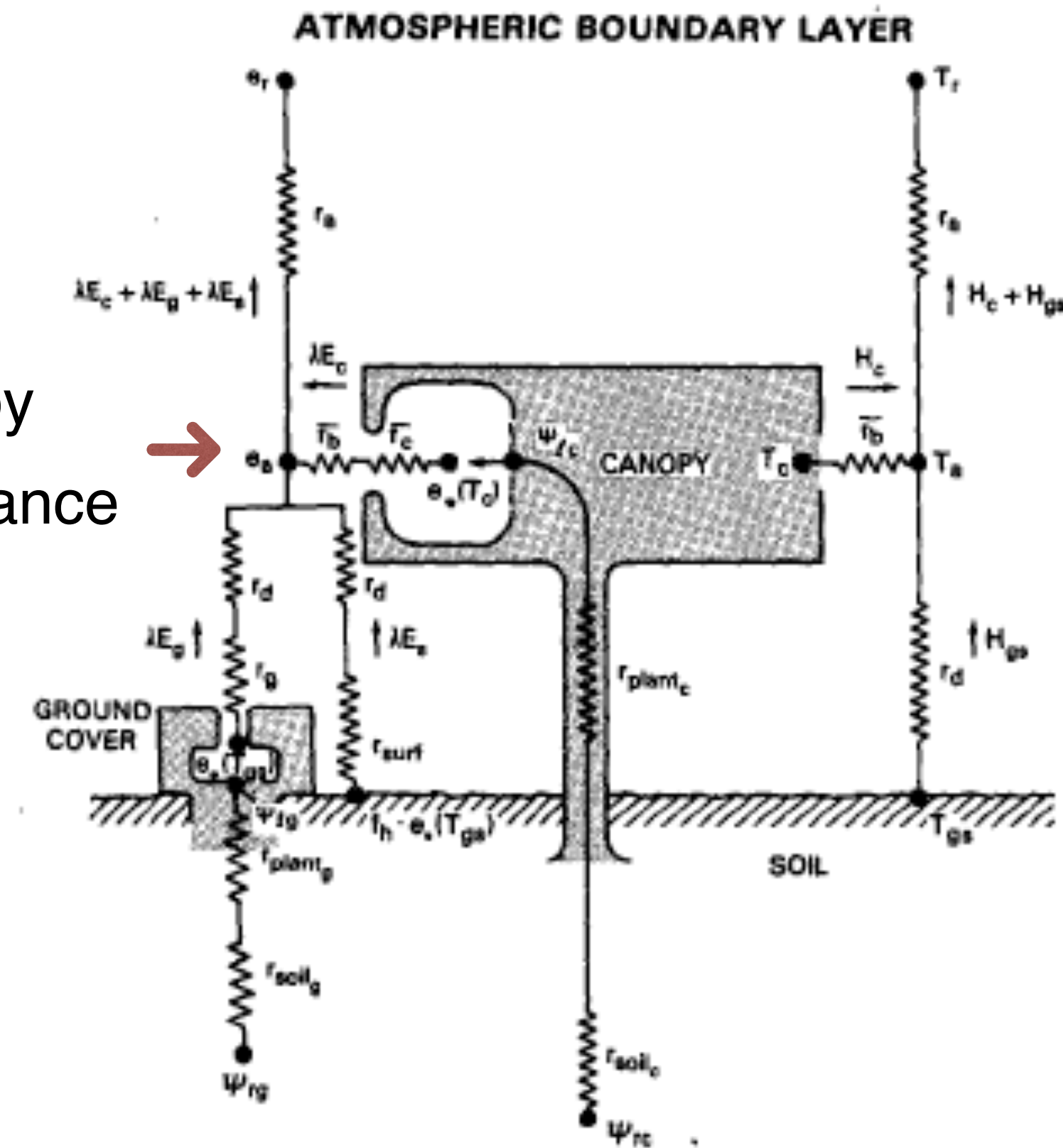


FIG. 2. Framework of the Simple Biosphere (SiB). The transfer pathways for latent and sensible heat flux are shown on the left- and right-hand sides of the diagram respectively. The treatment of radiation and intercepted water has been omitted for clarity. Symbols are defined in Table 2.

## A Simple Biosphere Model (SiB) for Use within General Circulation Models

P. J. SELLERS AND Y. MINTZ

*Dept. of Meteorology, University of Maryland, College Park, MD 20742*

Y. C. SUD

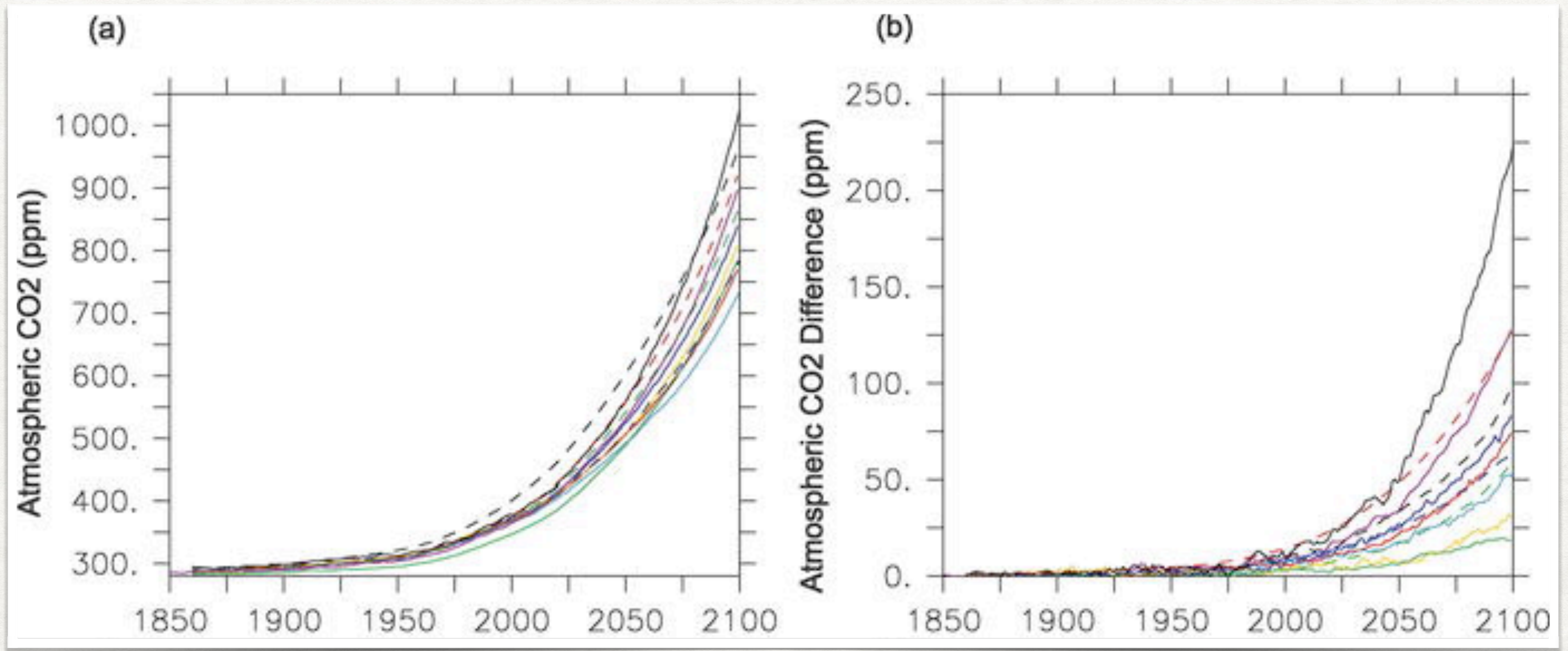
*Laboratory for Atmospheres, NASA/Goddard Space Flight Center, Greenbelt, MD 20771*

A. DALCHER

*Sigma Data Computing Corp., Rockville, MD 20850*

(Manuscript received 26 February 1985, in final form 5 September 1985)

# Climate-Carbon Feedbacks



Atmosphere  
(800)

**Atmospheric  
Carbon Net  
Annual Increase**  
**4**

**↑↑ GtC/y: Gigatons  
of carbon/year**  
*Numbers in parentheses  
refer to stored carbon  
pools. Red indicates  
carbon from human  
emissions.*

**120 + 3**

**Photosynthesis**

**60**

**Plant  
respiration**

**9**

**Fossil fuels,  
cement, and  
land-use  
change**

**60**

**Plant  
biomass  
(550)**

**90 + 2**

**Air-sea gas  
exchange**

**90**

**Net terrestrial  
uptake**  
**3**

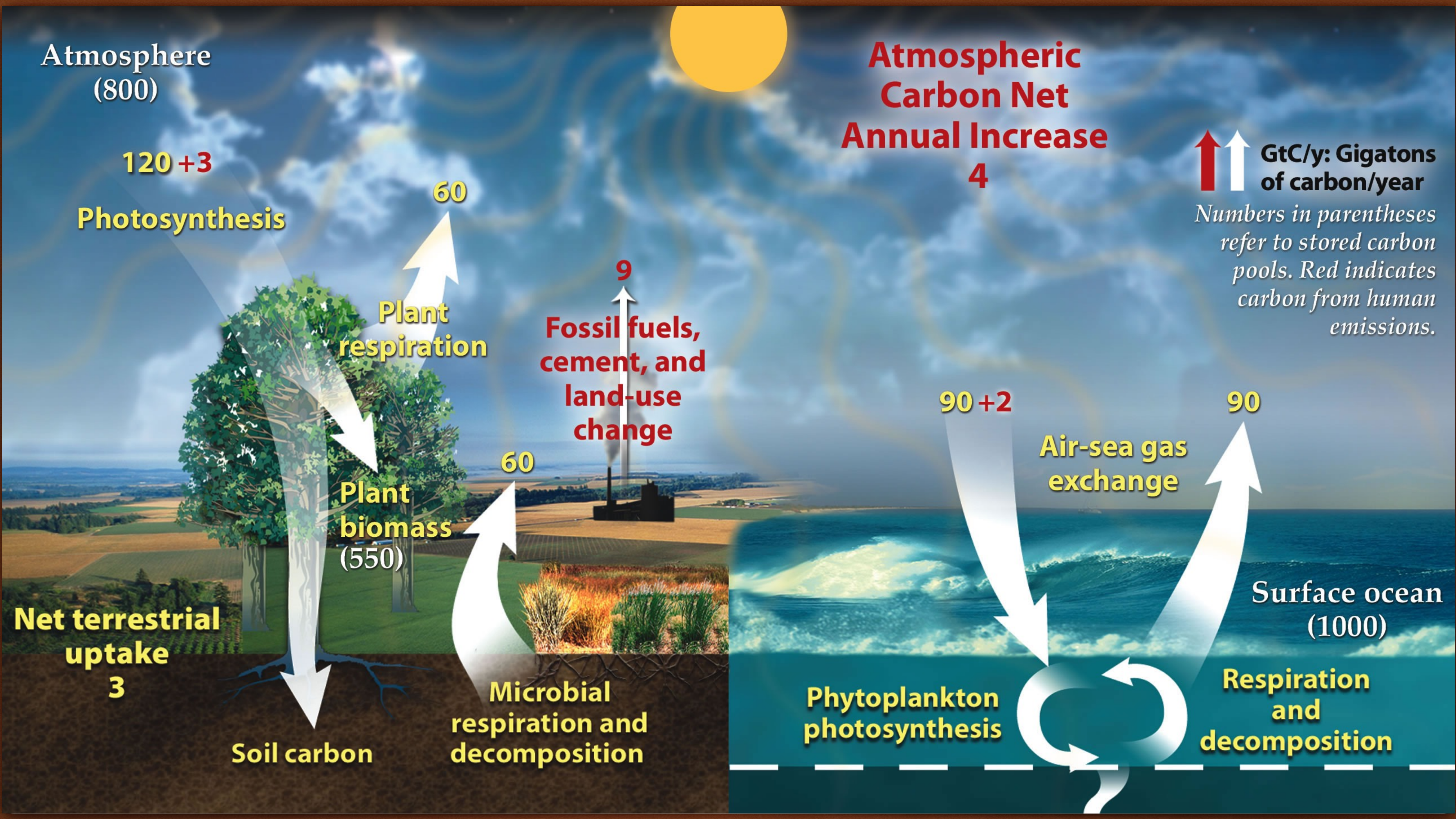
**Soil carbon**

**Microbial  
respiration and  
decomposition**

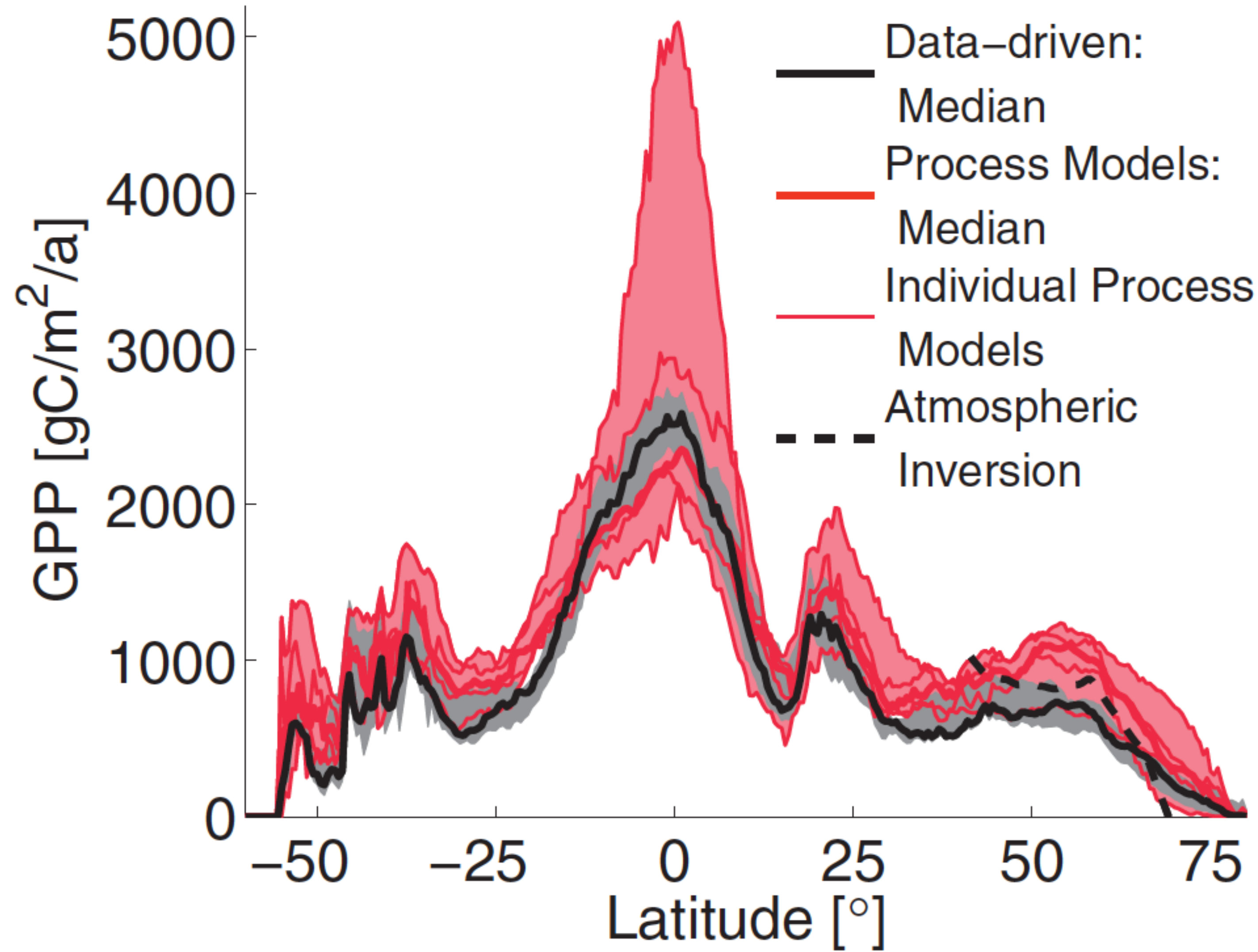
**Phytoplankton  
photosynthesis**

**Respiration  
and  
decomposition**

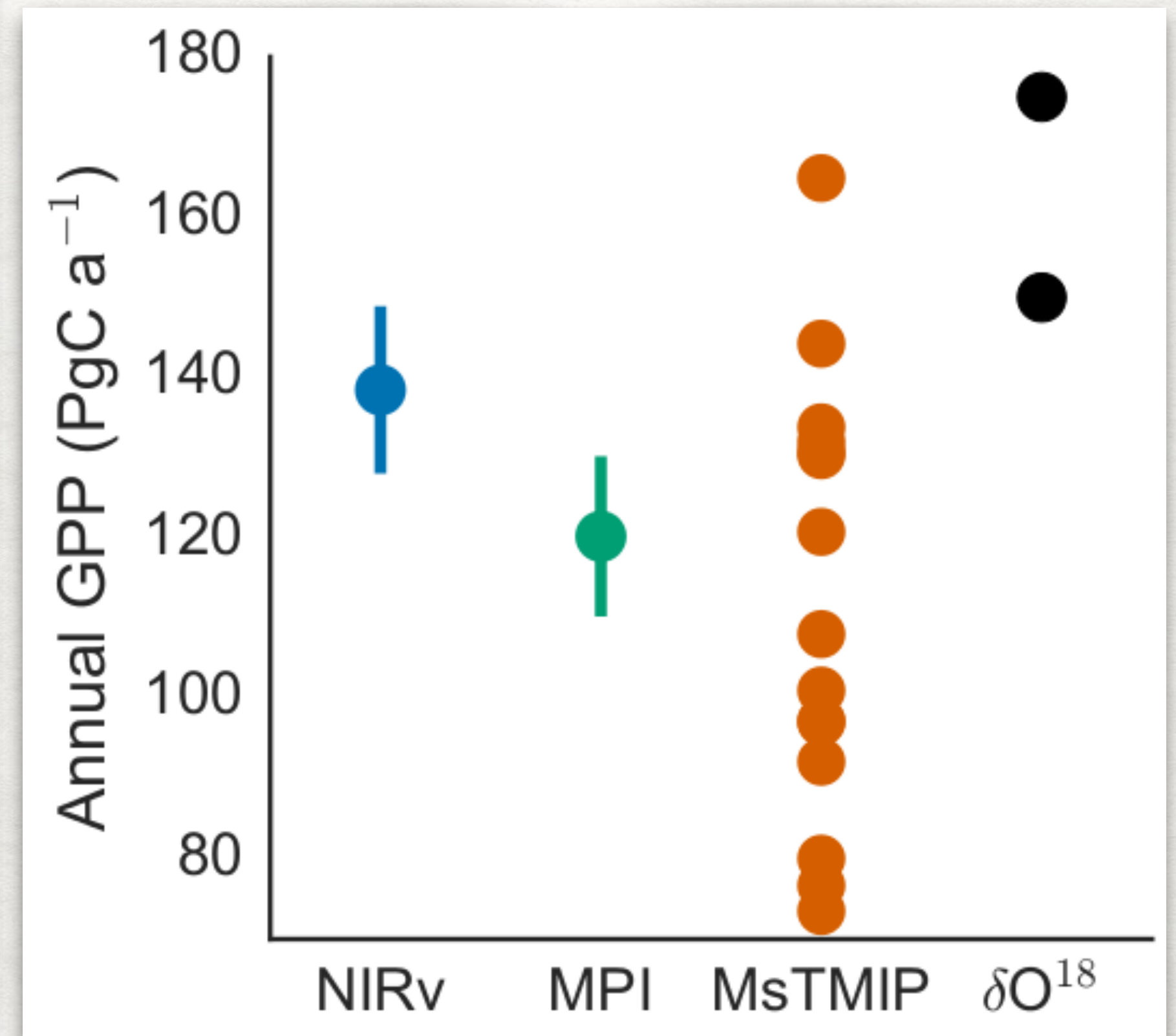
**Surface ocean  
(1000)**



# We don't do global photosynthesis very well



Grayson Badgley  
Lea Anderegg  
Joe Berry  
many others



Beer, C., Reichstein, M., Tomelleri, E., Ciais, P., Jung, M., Carvalhais, N., et al. (2010). Terrestrial Gross Carbon Dioxide Uptake: Global Distribution and Covariation with Climate. *Science*, 329(5993), 834–838. <http://doi.org/10.1126/science.1184984>



# Chlorophyll Fluorescence is a “new” remote sensing product

Plascyk, J. A. (1975). The MK II Fraunhofer Line Discriminator (FLD-II) for Airborne and Orbital Remote Sensing of Solar-Stimulated Luminescence. *Optical Engineering*, 14(4), 339–0. <http://doi.org/10.1117/12.7971842>

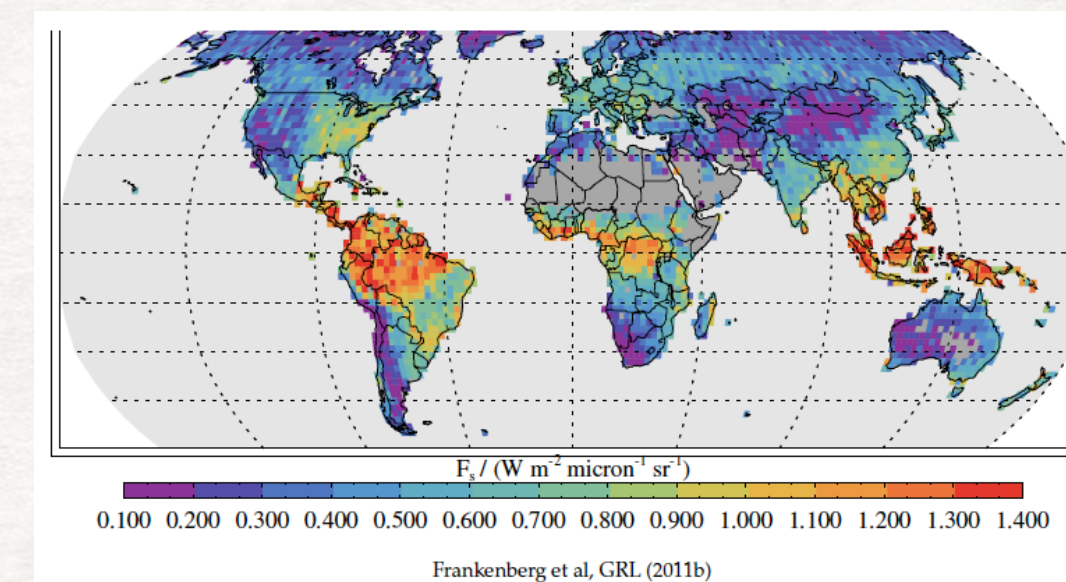
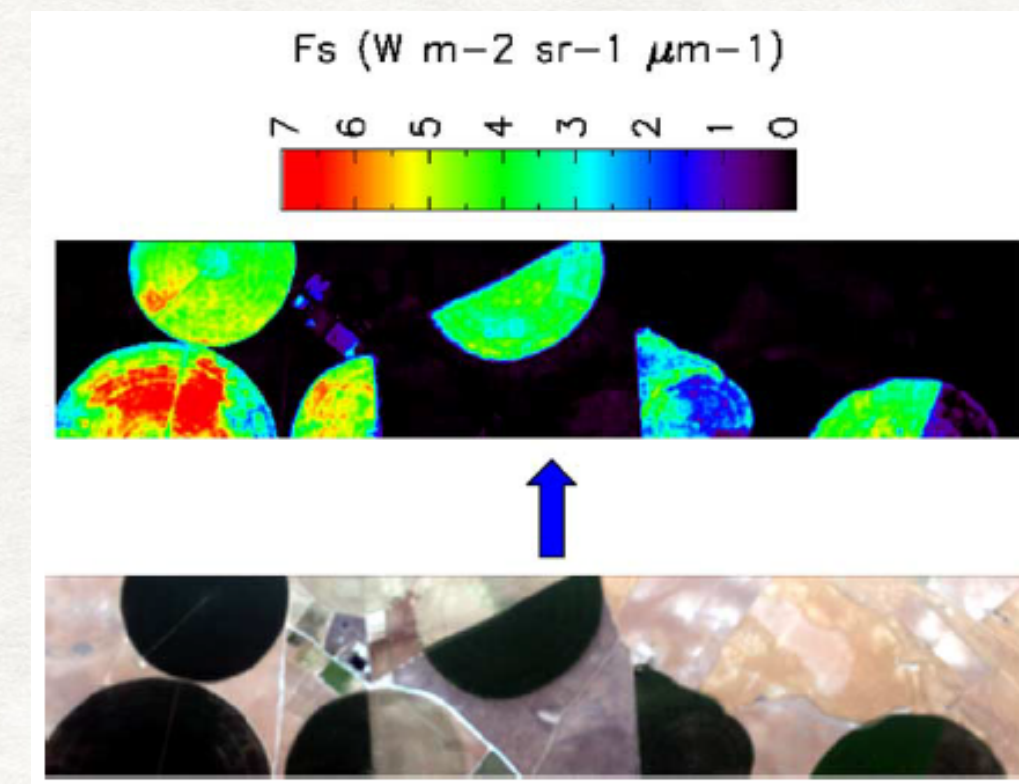
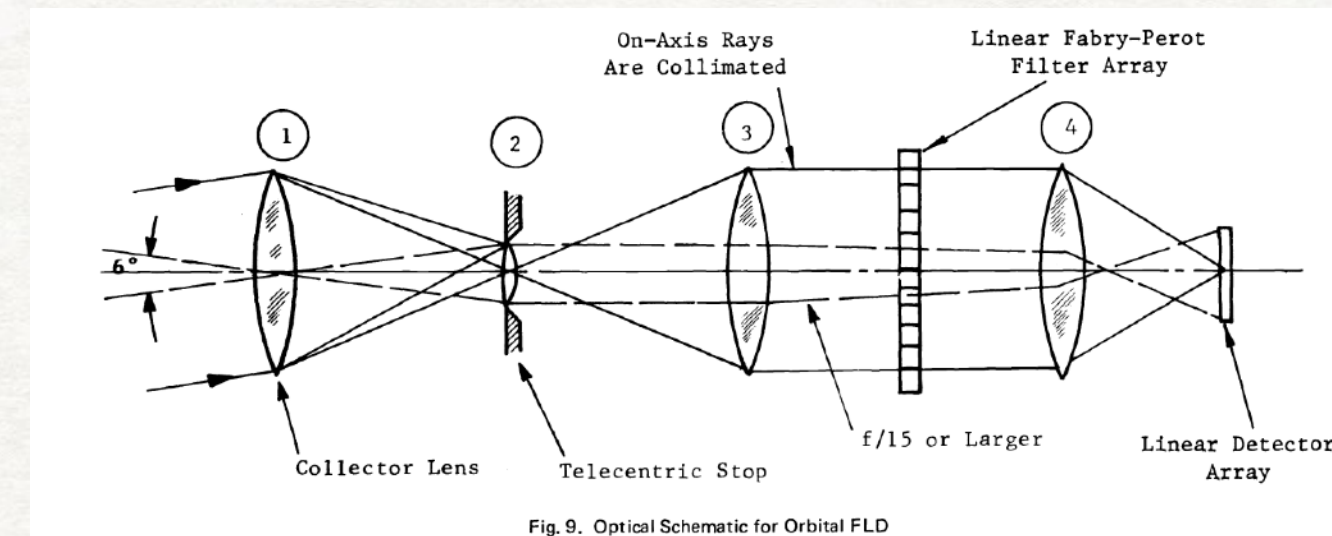
Guanter, L., Alonso, L., Gómez-Chova, L., Amorós-López, J., Vila, J., & Moreno, J. (2007). Estimation of solar-induced vegetation fluorescence from space measurements. *Geophysical Research Letters*, 34(8), L08401. <http://doi.org/10.1029/2007GL029289>

Frankenberg, C., Butz, A., & Toon, G. C. (2011). Disentangling chlorophyll fluorescence from atmospheric scattering effects in O 2A-band spectra of reflected sun-light. *GEOPHYSICAL RESEARCH LETTERS*, 38(3), L03801. doi: 10.1029/2010GL045896

Joiner, J., Yoshida, Y., Vasilkov, A. P., Yoshida, Y., Corp, L. A., & Middleton, E. M. (2011). First observations of global and seasonal terrestrial chlorophyll fluorescence from space. *Biogeosciences*, 8(3), 637–651. doi:10.5194/bg-8-637-2011

Retrievals now from: GOSAT, GOME-2 & OCO-2

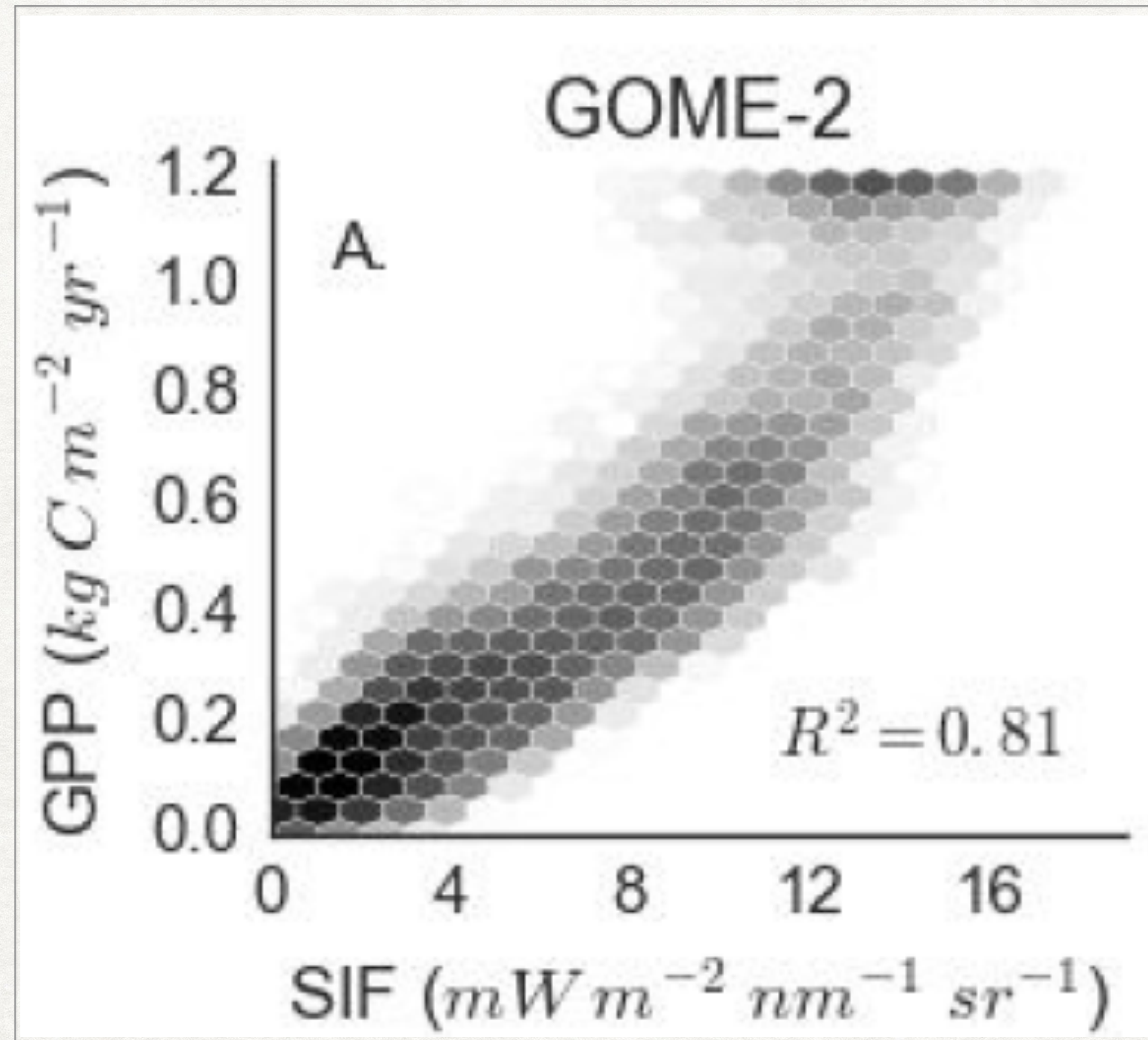
FLEX is selected and scheduled for launch in 2020's!



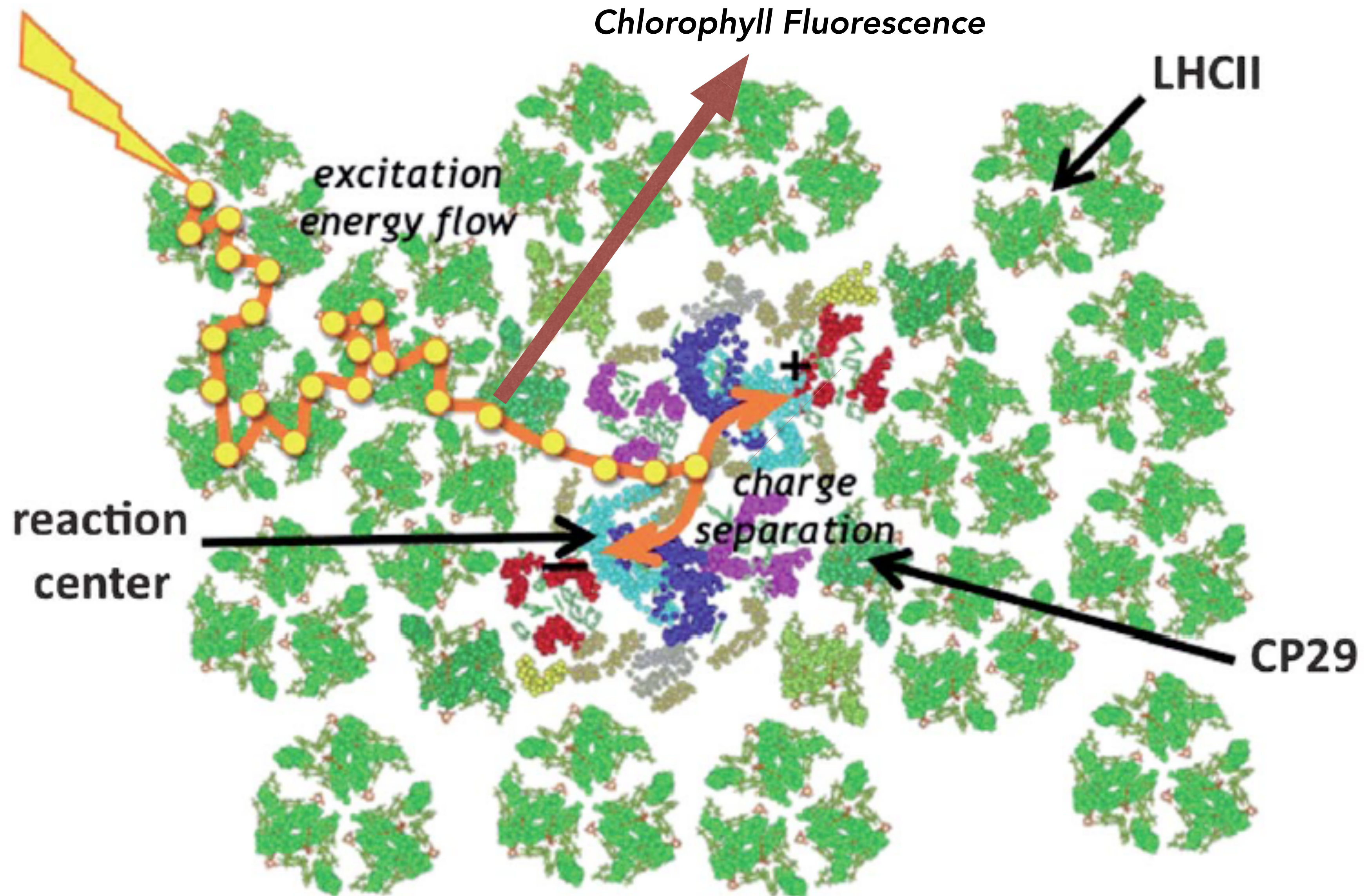


## SIF is correlated with GPP

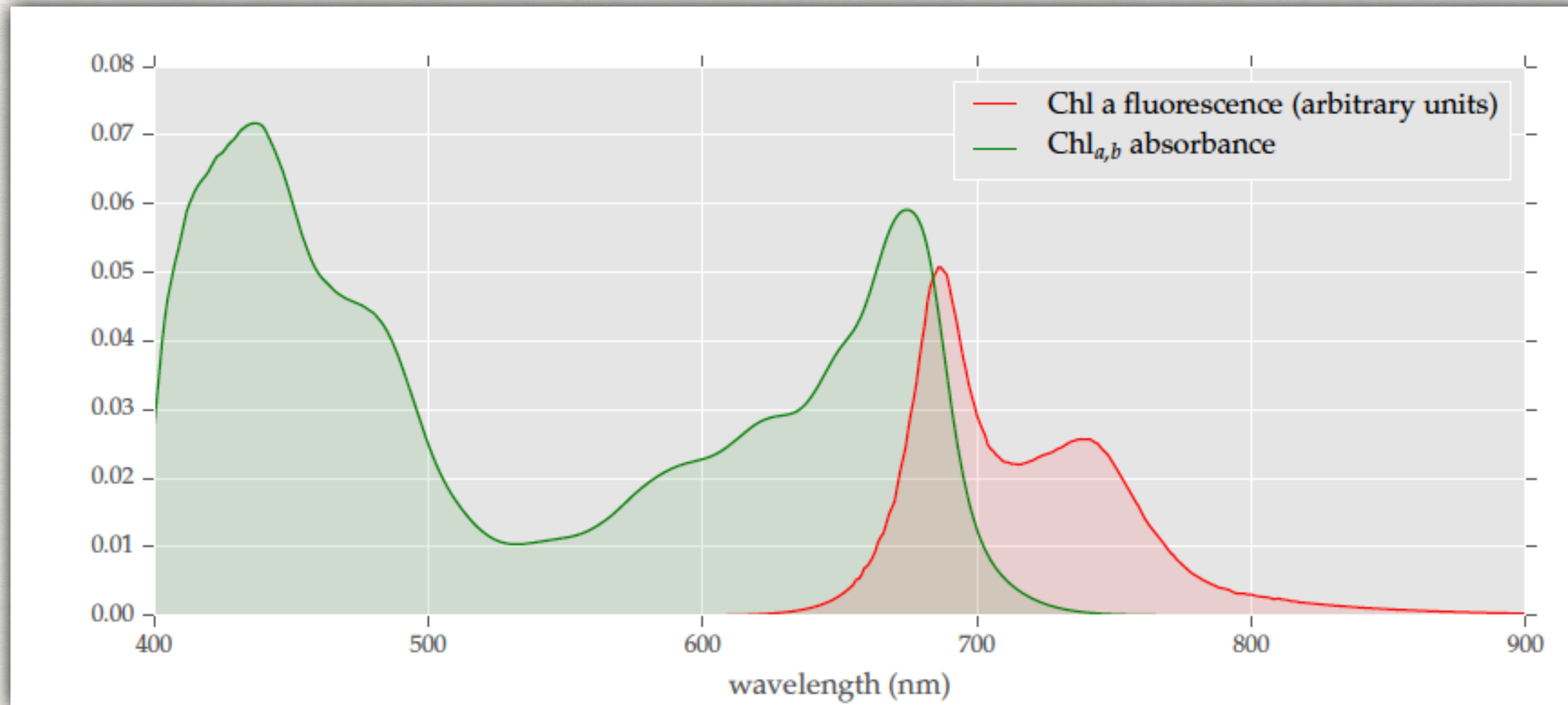
Monthly MPI-GPP at 0.5° vs SIF (GOME-2)



# SIF Results from the Decay of an Excited Chlorophyll Molecule



## Solar induced Fluorescence (SIF) is Specific to Light Absorbed by Chlorophyll



# SIF can be Detected from Space

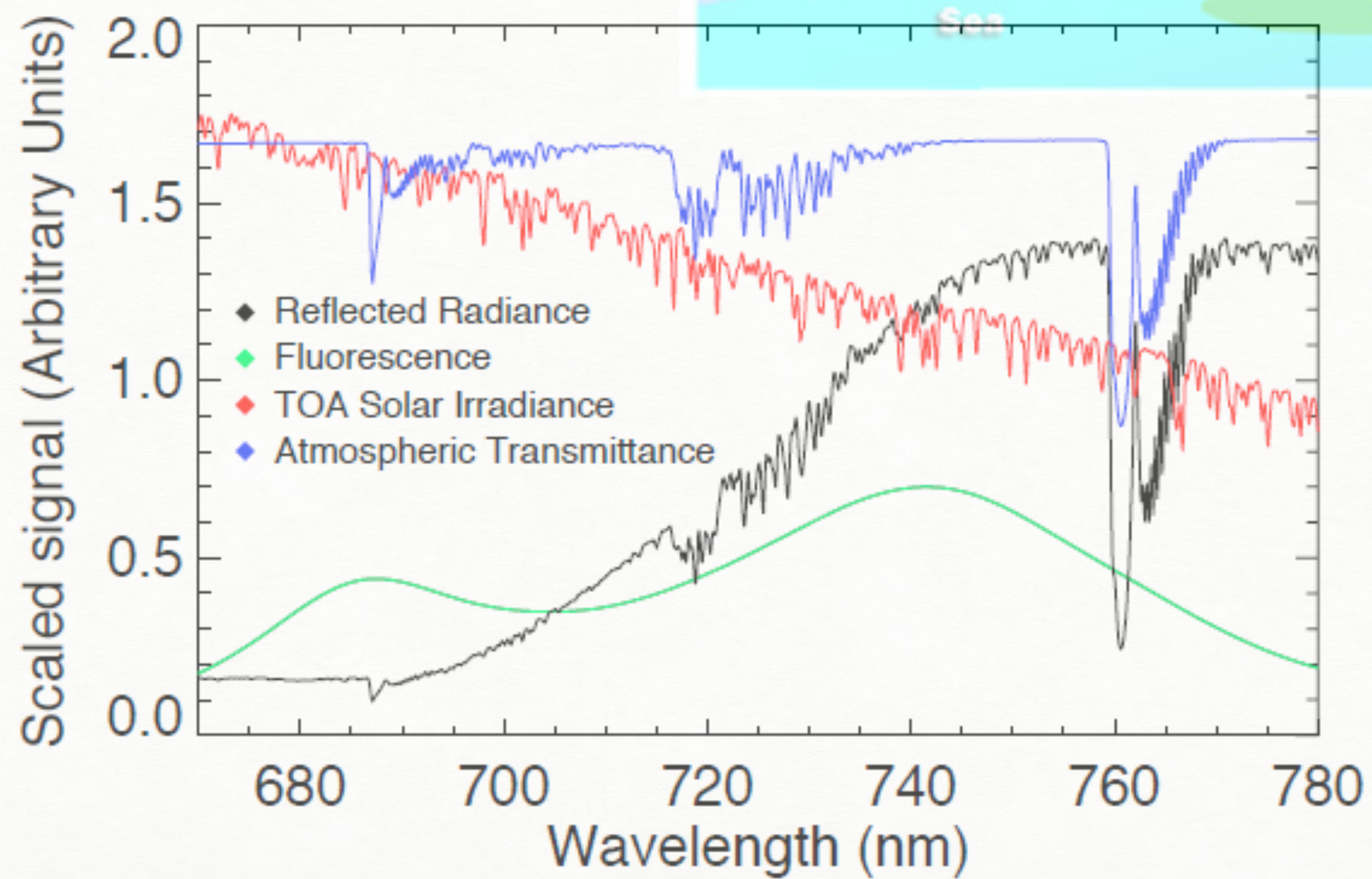
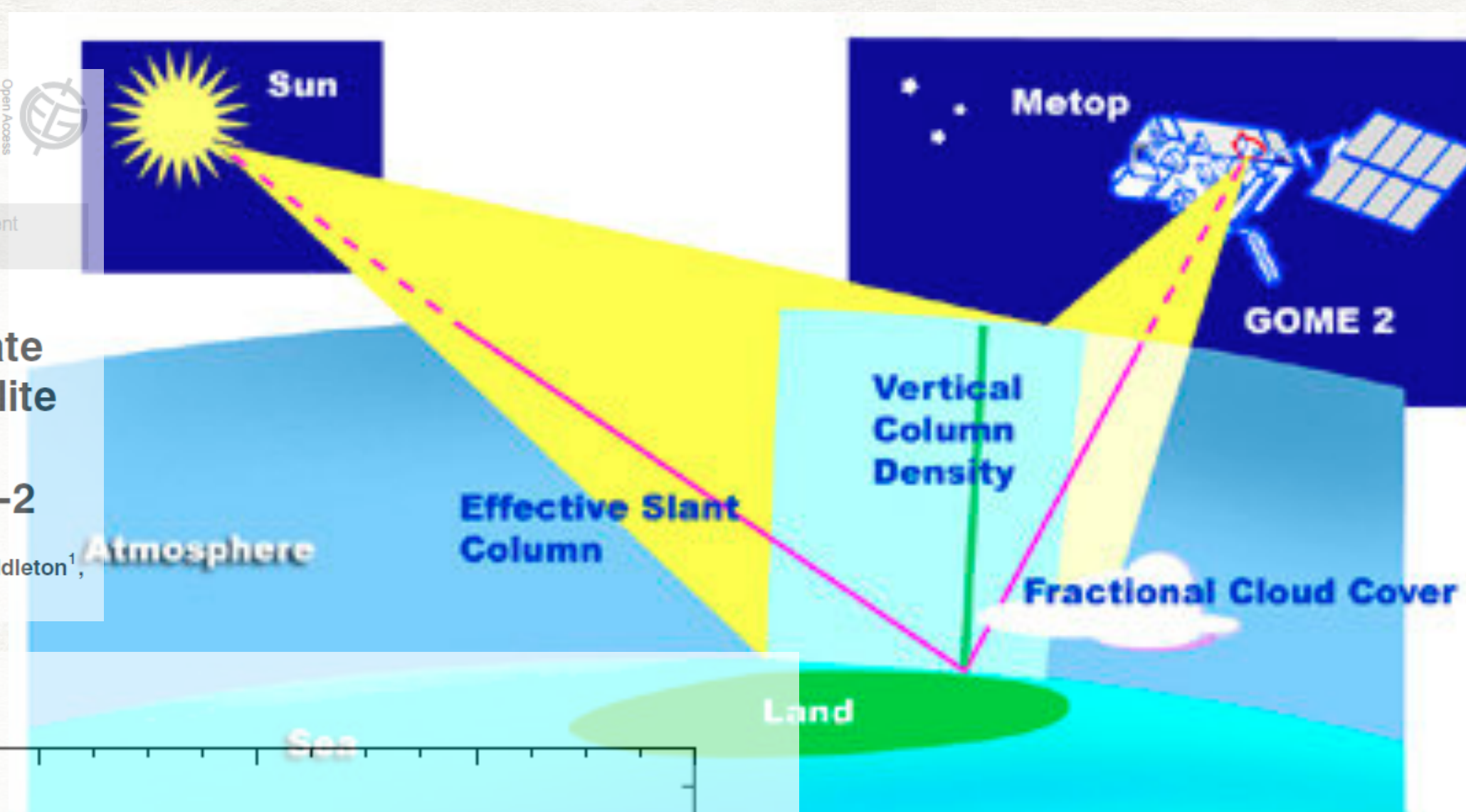
Atmos. Meas. Tech. Discuss., 6, 3883–3930, 2013  
www.atmos-meas-tech-discuss.net/6/3883/2013/  
doi:10.5194/amtd-6-3883-2013  
© Author(s) 2013. CC Attribution 3.0 License.

Atmospheric  
Measurement  
Techniques  
Discussions

This discussion paper is/has been under review for the journal Atmospheric Measurement Techniques (AMT). Please refer to the corresponding final paper in AMT if available.

## Global monitoring of terrestrial chlorophyll fluorescence from moderate spectral resolution near-infrared satellite measurements: methodology, simulations, and application to GOME-2

J. Joiner<sup>1</sup>, L. Guanter<sup>2</sup>, R. Lindstrot<sup>2</sup>, M. Voigt<sup>2</sup>, A. P. Vasilkov<sup>3</sup>, E. M. Middleton<sup>1</sup>, K. F. Huemmrich<sup>4</sup>, Y. Yoshida<sup>3</sup>, and C. Frankenberg<sup>5</sup>



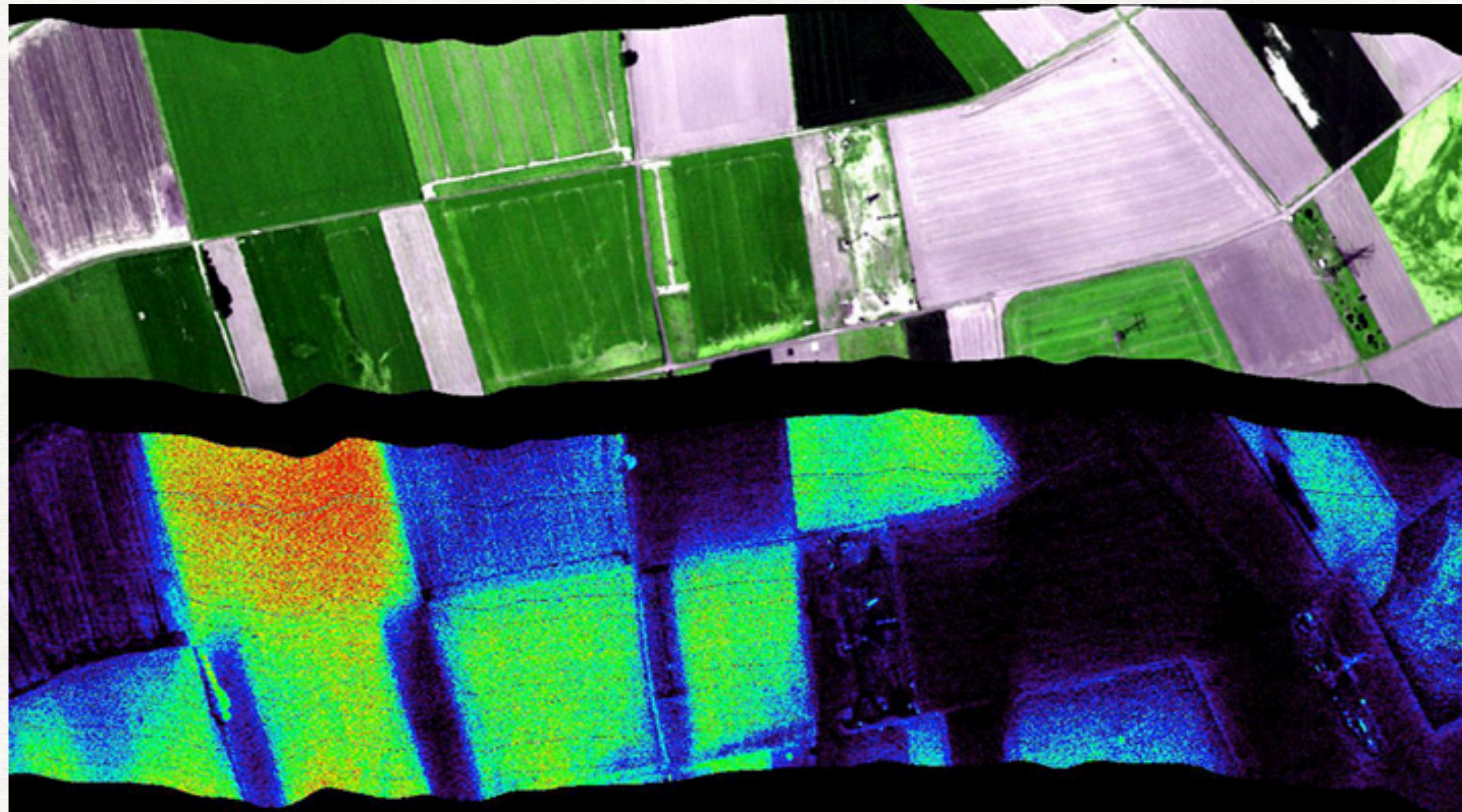
GOME-2  
40 x 60 km pixel  
daily update  
global coverage  
9:30 AM crossing time



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- SIF is specific to vegetation
- Reflectance “sees” the whole scene
- SIF is less sensitive to atmospheric scattering
- SIF radiance is correlated with GPP

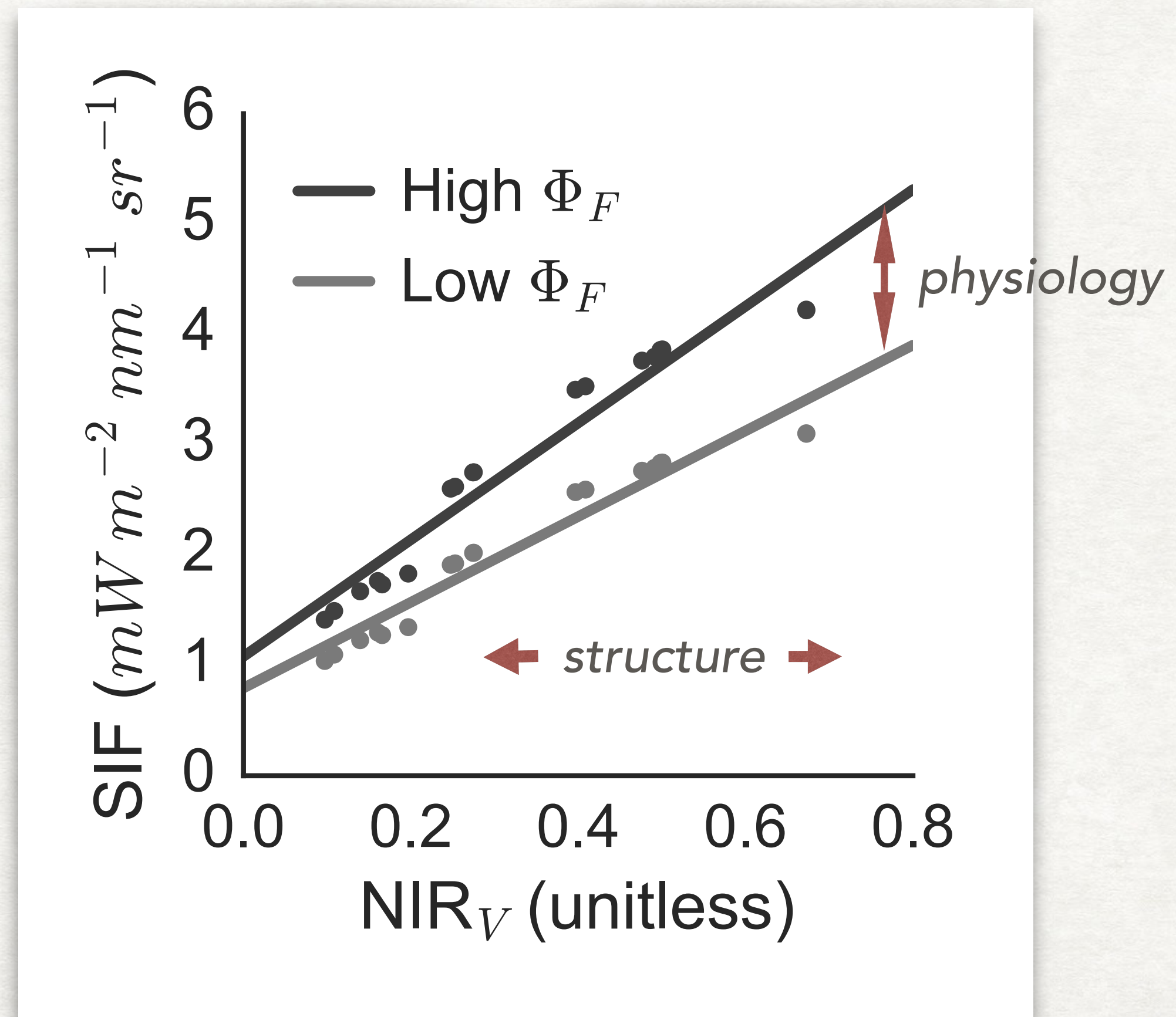


HyPlant (aircraft) Image of SIF and Greenness

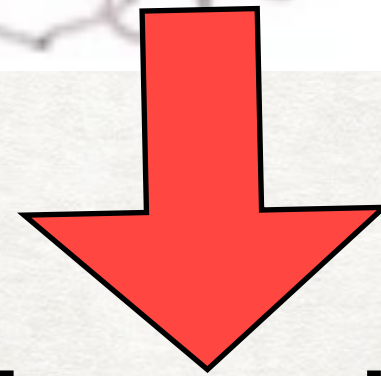
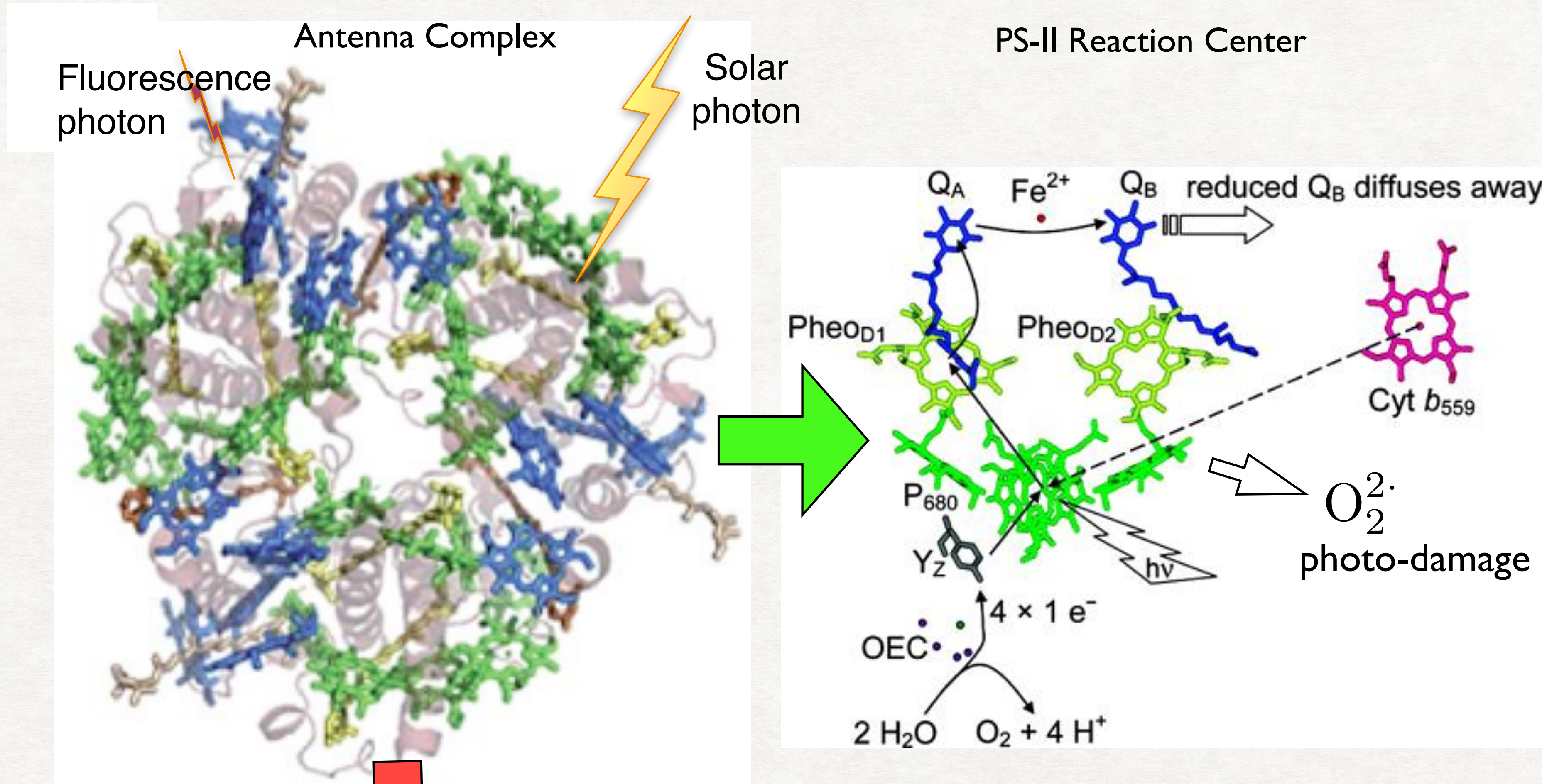
(Uwe Rascher)

The correlation between SiF and GPP is based on:

- Physiological control of the yield of fluorescence ( $\Phi_F$ )
- Structural properties of the canopy that effect leaf display



# Physiology - PSII "decides" what to do with an absorbed photon

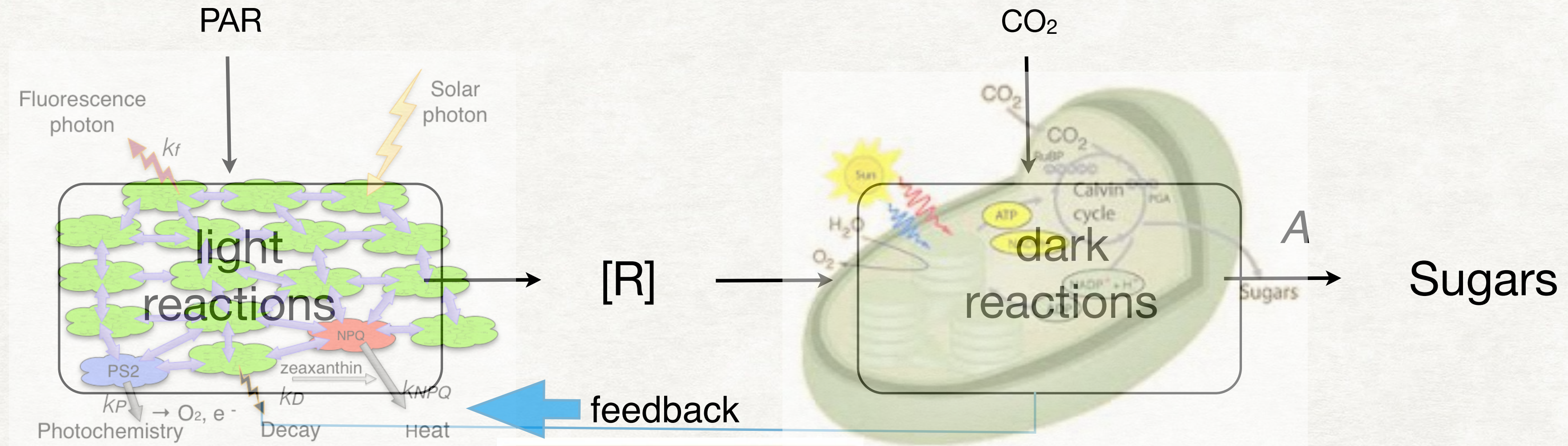


Non-photochemical  
Quenching

Fleming, G. R., Schlau-Cohen, G. S., Amarnath, K., & Zaks, J. (2012). Design principles of photosynthetic light-harvesting. *Faraday Discussions*, 155, 27. <http://doi.org/10.1039/c1fd00078k>

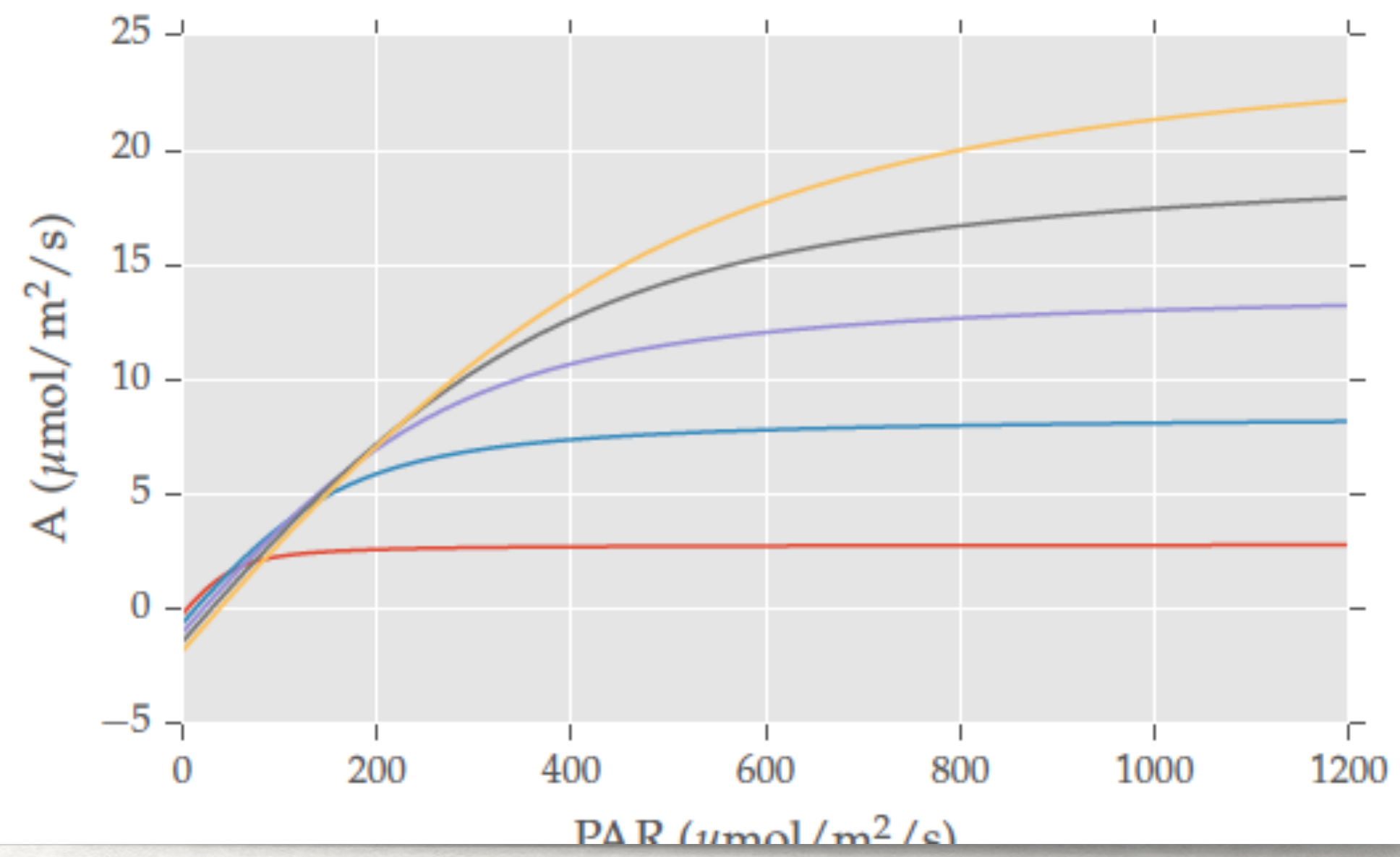
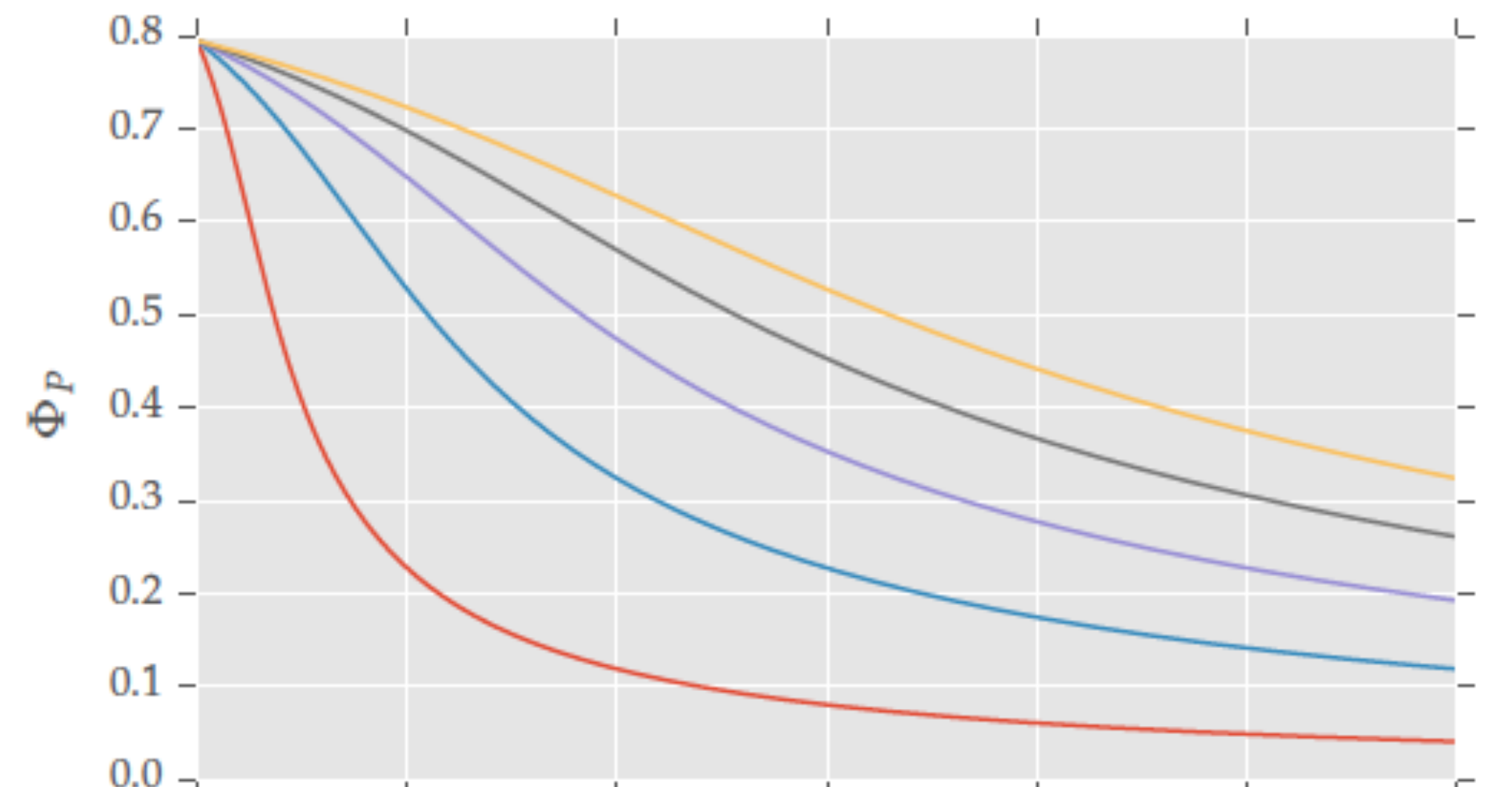
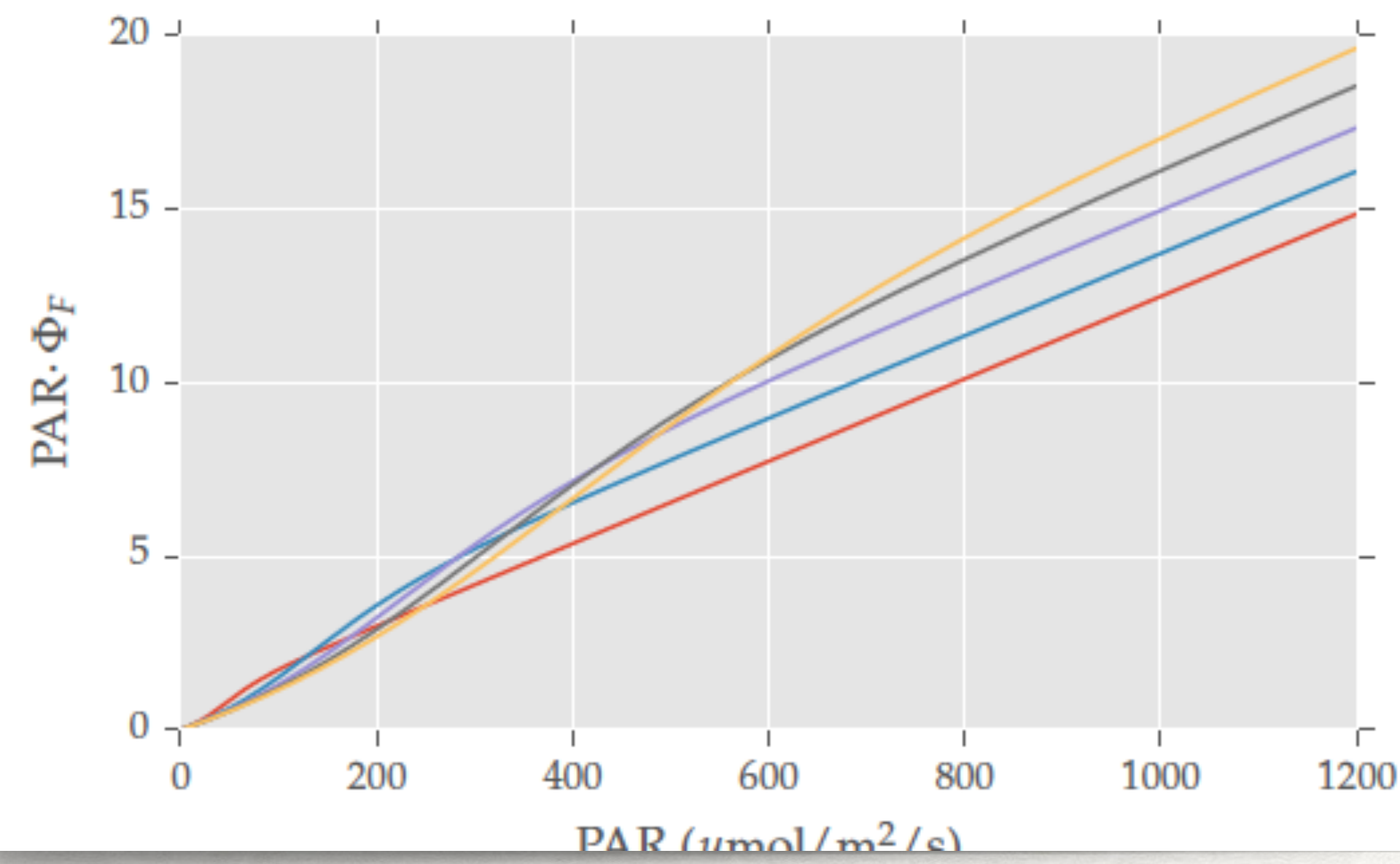
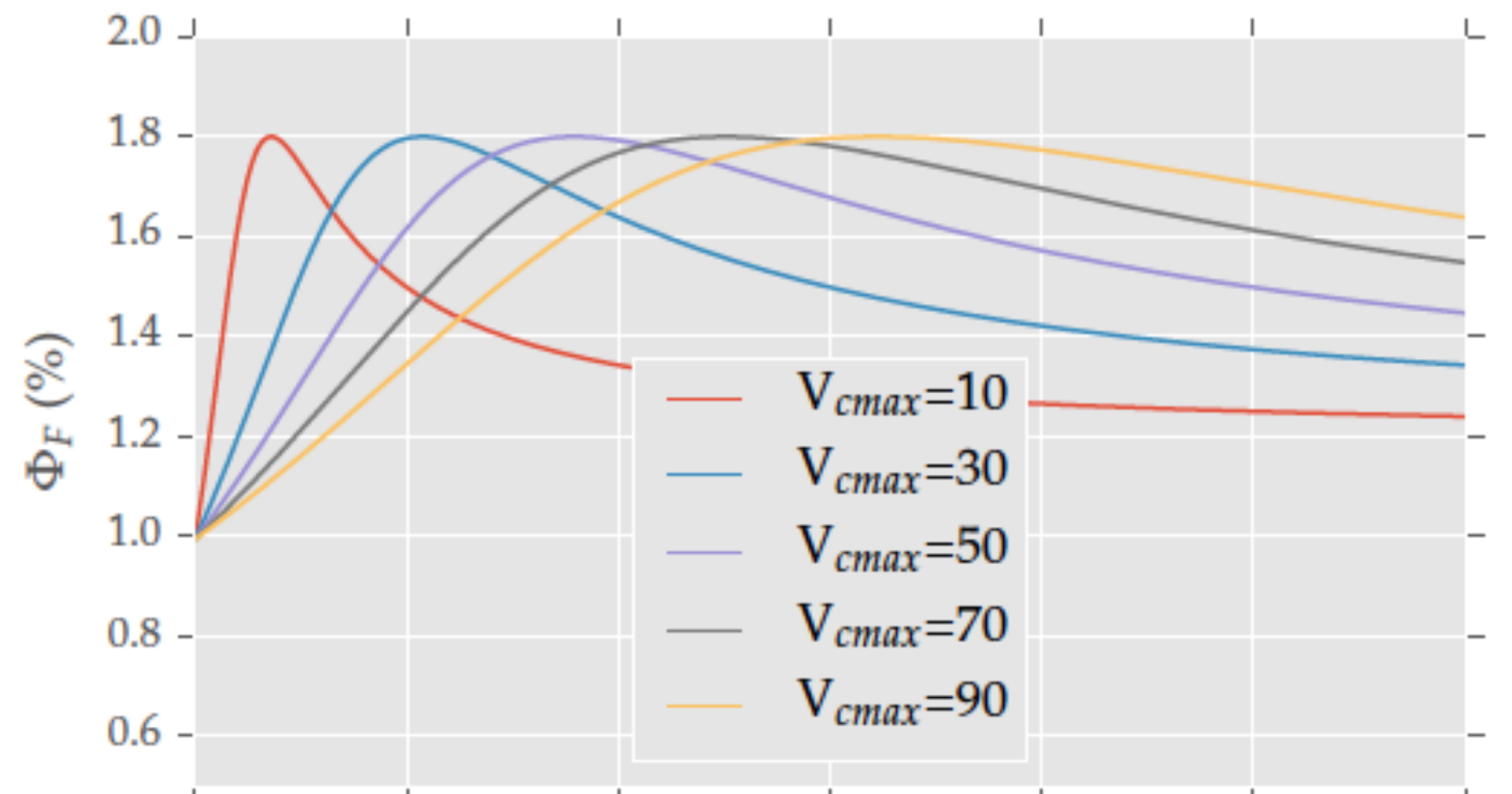


# Interactions between the light and dark reactions:



$$A \approx \min \begin{cases} \text{light reactions } (W_L) \\ \text{dark reactions } (W_C) \end{cases}$$

# Modeled Leaf Physiology

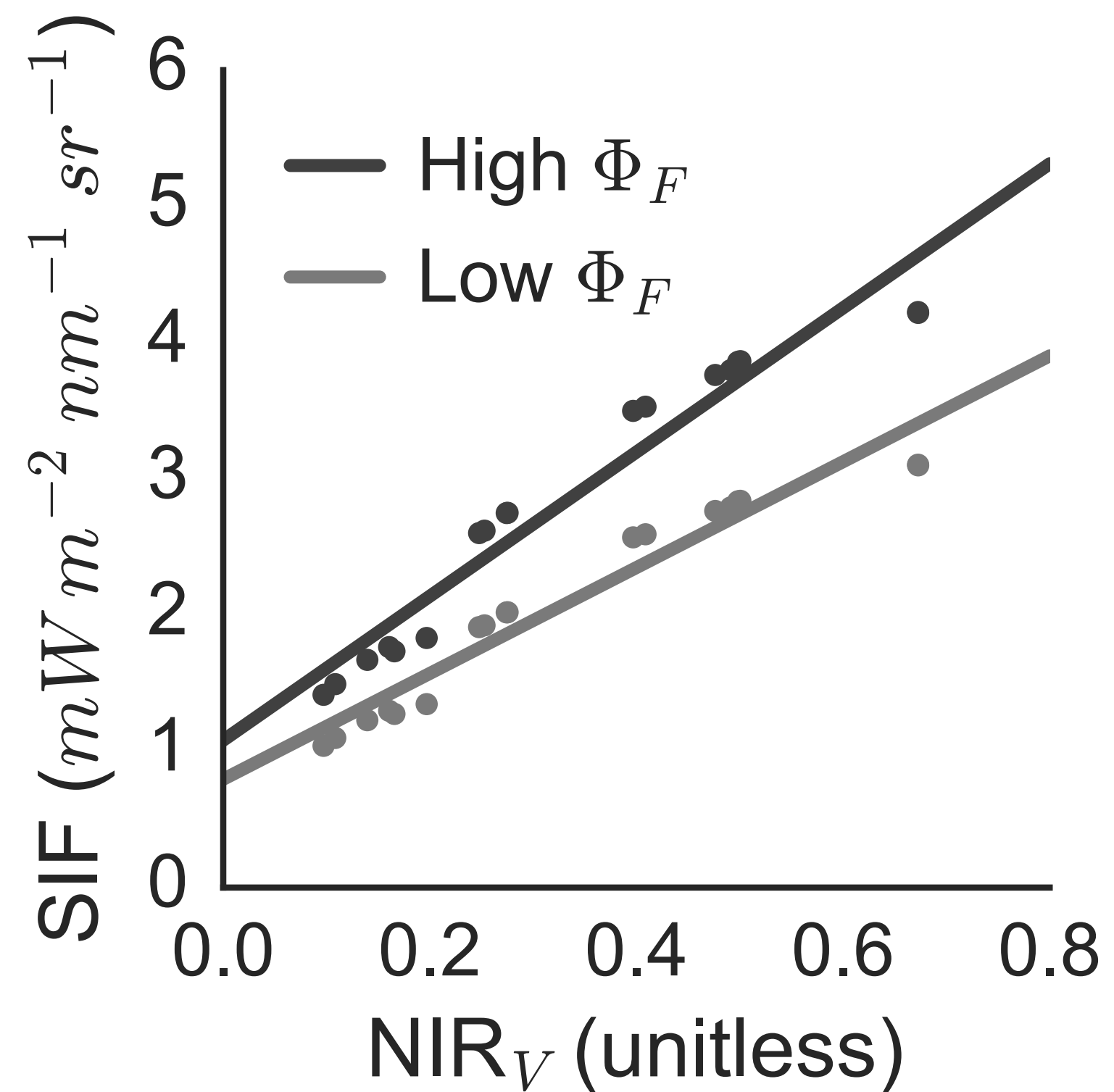
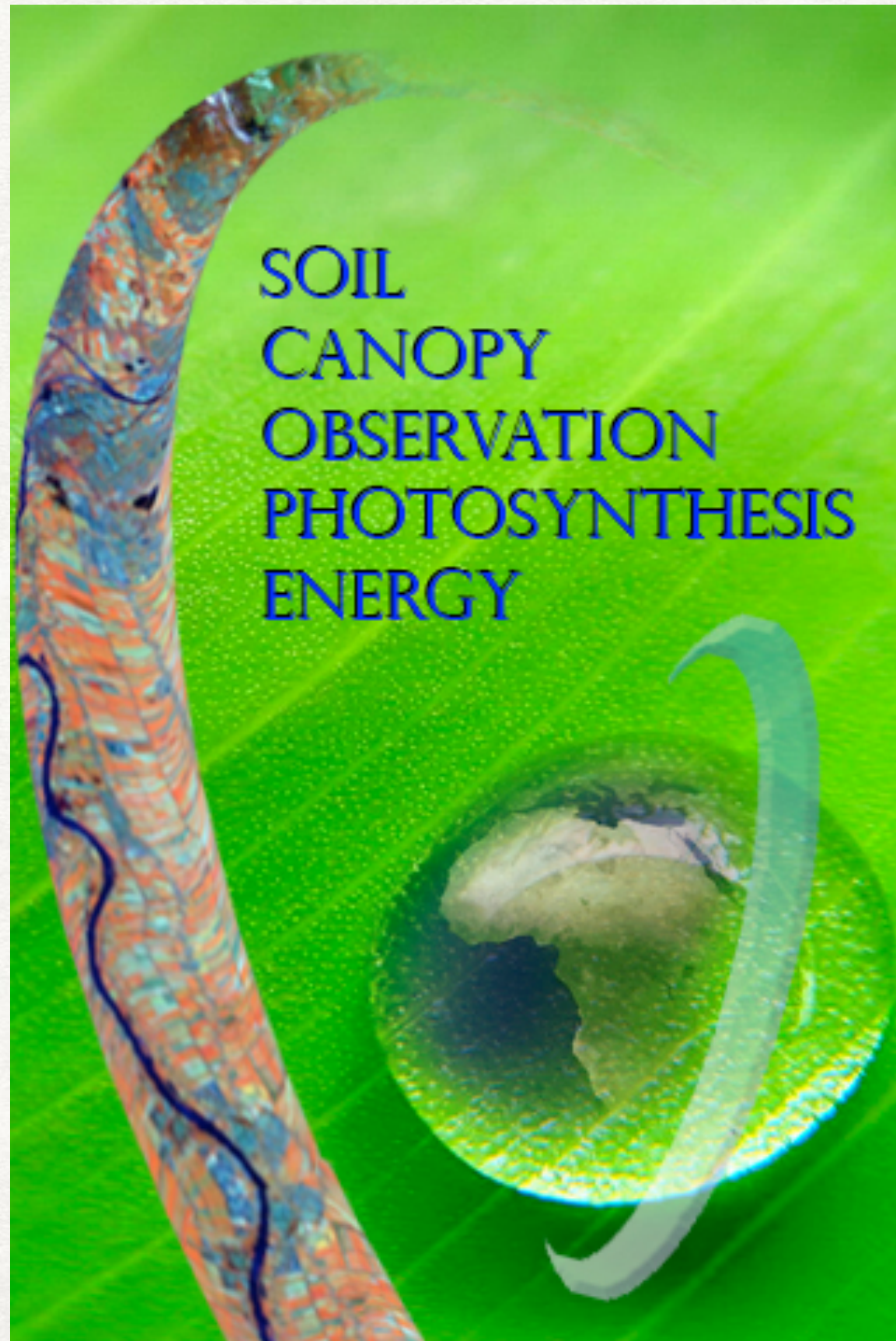


## Summary: Physiology and SIF

- We have linked a fluorescence parameterization to a conventional photosynthesis model by inverting the Genty equation.
- This requires knowledge of one more *adjustable* leaf property,  $K_N^0$ . Requires PAM measurements.
- The  $V_{cm}$  RUBISCO (or effects of stress on it) have a large control on SIF.
- This parameterization has been added to SCOPE and the land surface models, SiB and CLM.

## The Effect of Canopy Structure on SIF

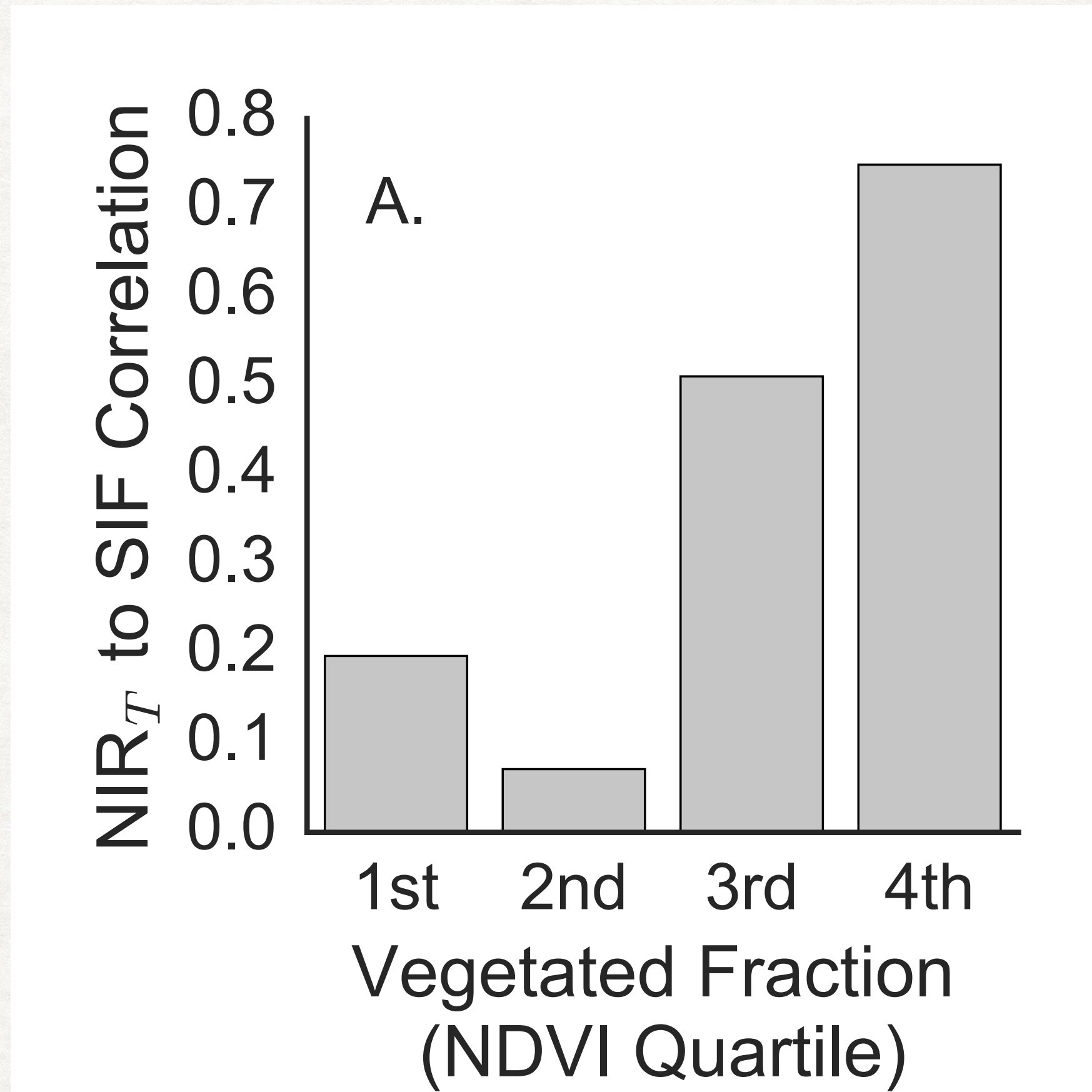
Modeling studies with SCOPE indicate that near infrared reflectance (NIR) from vegetation is strongly correlated with SIF and is sensitive to differences in fluorescence yield.



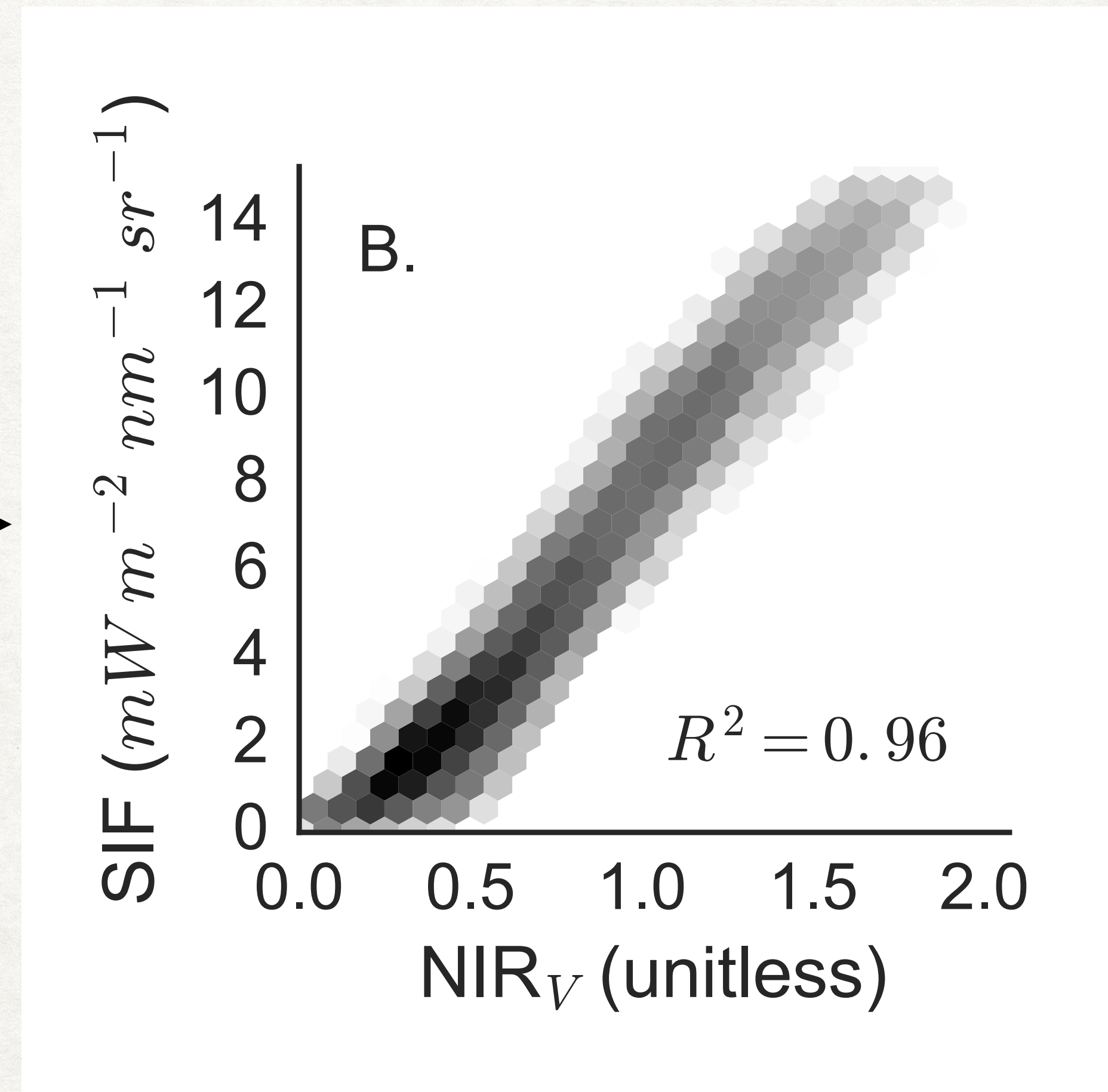
The probability that a fluorescence photon escapes is similar to that of a reflected NIR photon.



NDVI x NIR Radiance = NIR<sub>V</sub> (vegetation)?



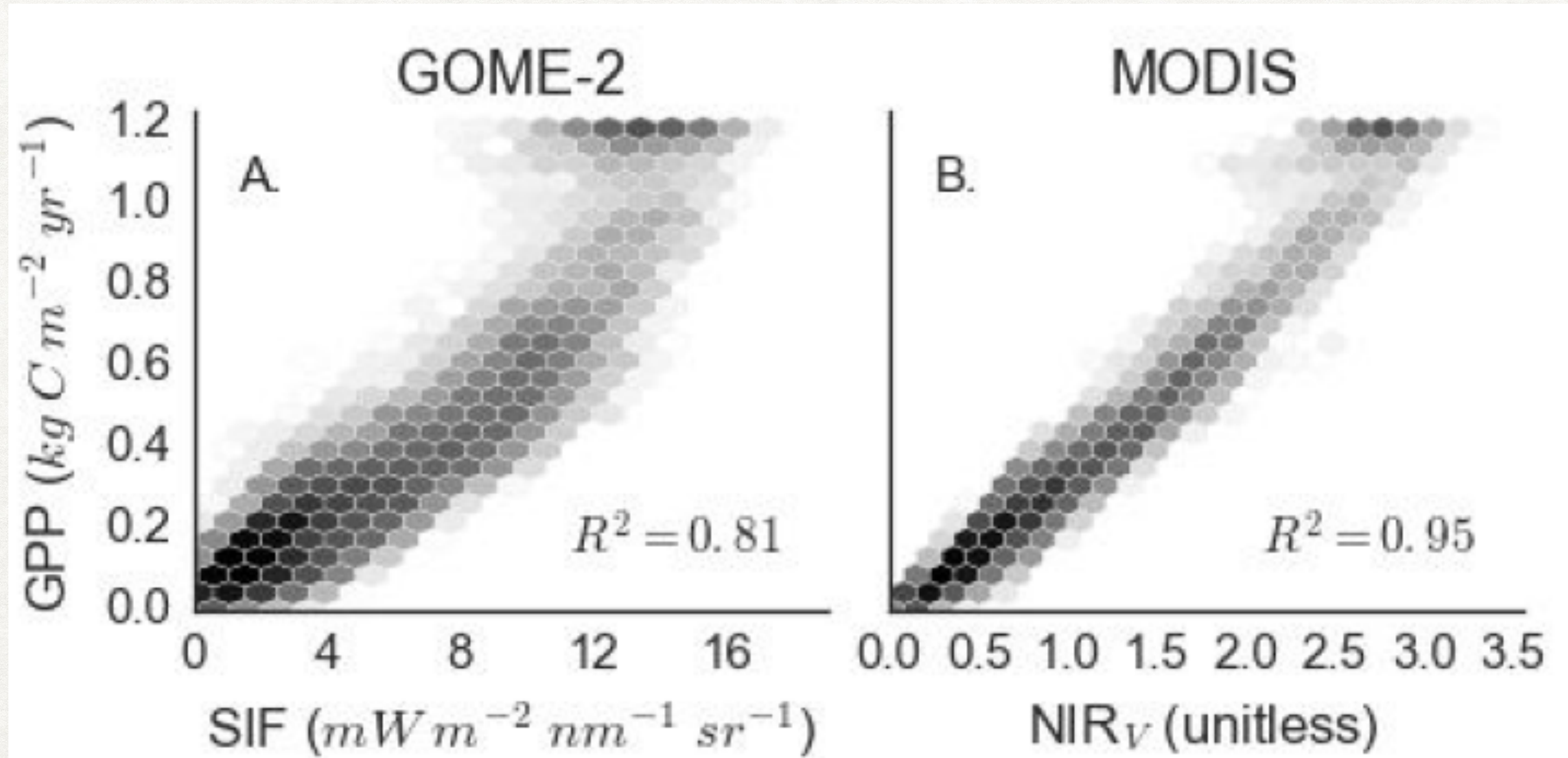
NIR<sub>T</sub> \* NDVI





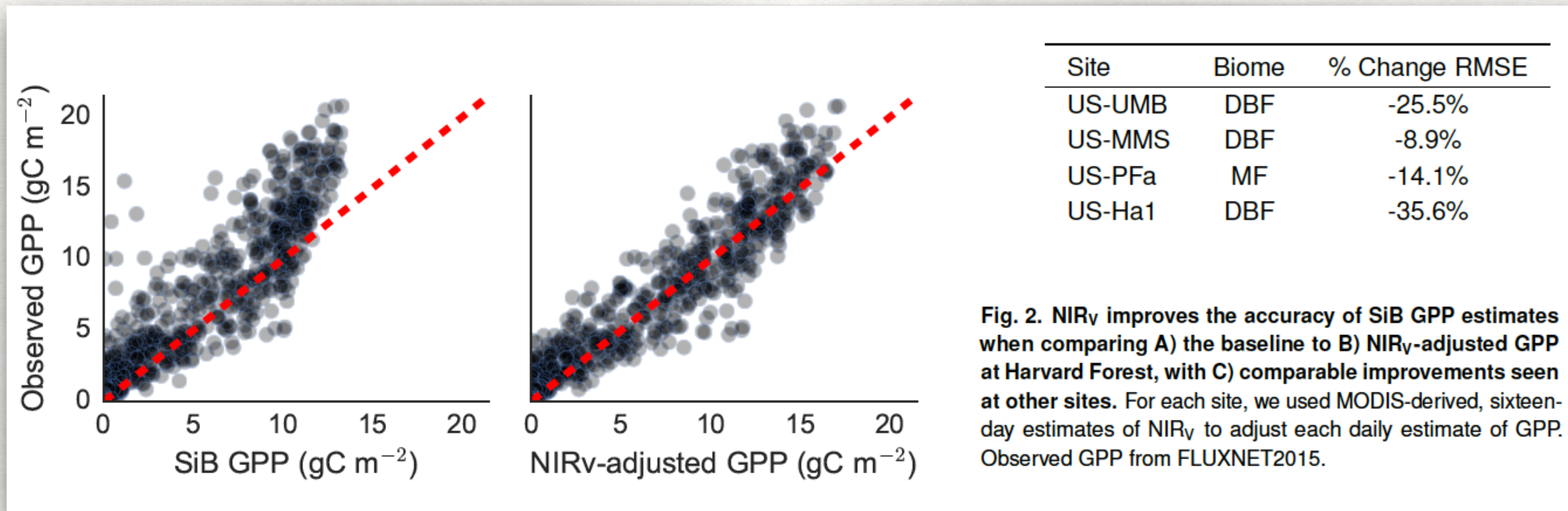
# CAN WE USE NIR<sub>V</sub> TO ESTIMATE GPP?

Monthly MPI-GPP at 0.5° vs SIF (GOME-2) or NIR<sub>V</sub> (MODIS)



Badgley, G., Field, C. B., & Berry, J. A. (2017). Canopy near-infrared reflectance and terrestrial photosynthesis. *Science Advances*, 3(3), e1602244. <http://doi.org/10.1126/sciadv.1602244>

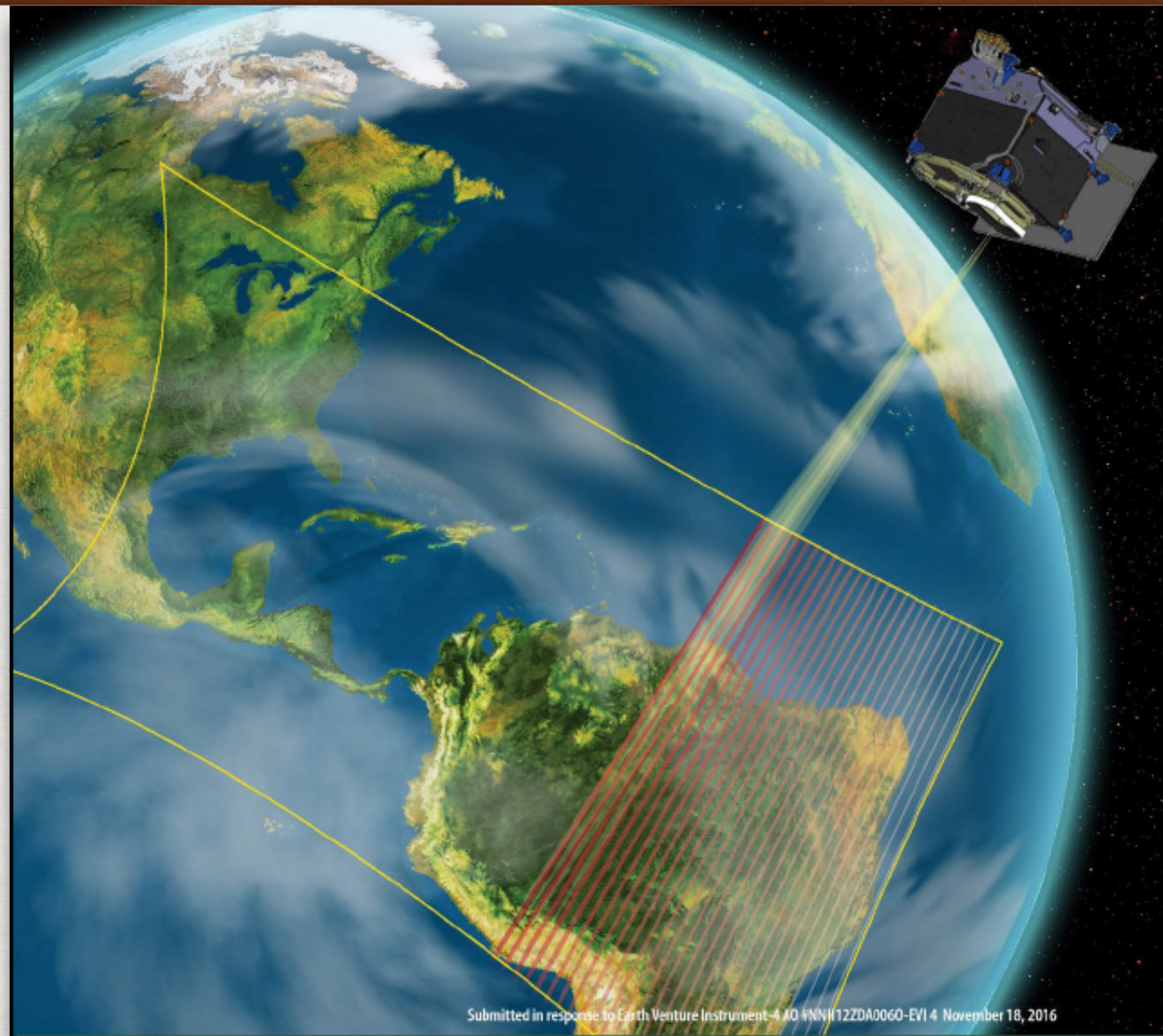
Making the canopy integration factor ( $\pi$ ) in the SiB 3 proportional to SIF or  $\text{NIR}_v$  improves the match to observation at AmeriFlux sites.



## Final Thoughts on SIF:

- SIF is turning out to be surprisingly useful:
  - Seems to be proportional to GPP;
  - Indicates drought;
  - Indicates beginning and end of growing season.
  - Seems to be related to Vcm Rubisco
- It is also a hot topic in fundamental research on photosynthesis - connection to another community.
- $NIR_V$  is a good proxy for SIF, but the latter would probably be more reliable if we had an appropriate satellite.
- OCS exchange may provide another way to check on GPP





Submitted in response to Earth Venture Instrument-4 AO #NNH12ZDA0060-EVI 4 November 18, 2016

# FOLIAGE

Fluorescence Observatory for monitoring vegetation Light-use efficiency, Agriculture, & Ecosystem function

Principal Investigator: Dr. Joseph Berry  
Carnegie Institution for Science

Authorizing Official: Matthew P. Scott, President  
Carnegie Institution for Science

*Joseph Berry*

*Matthew Scott*

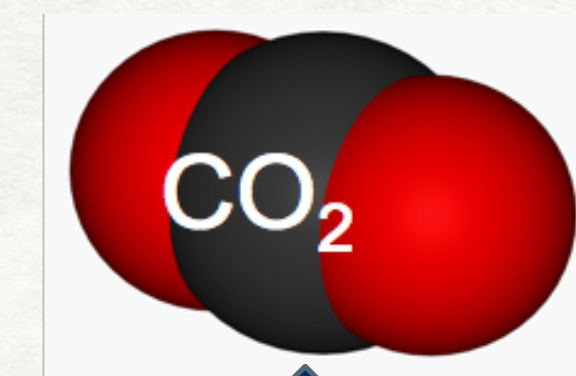
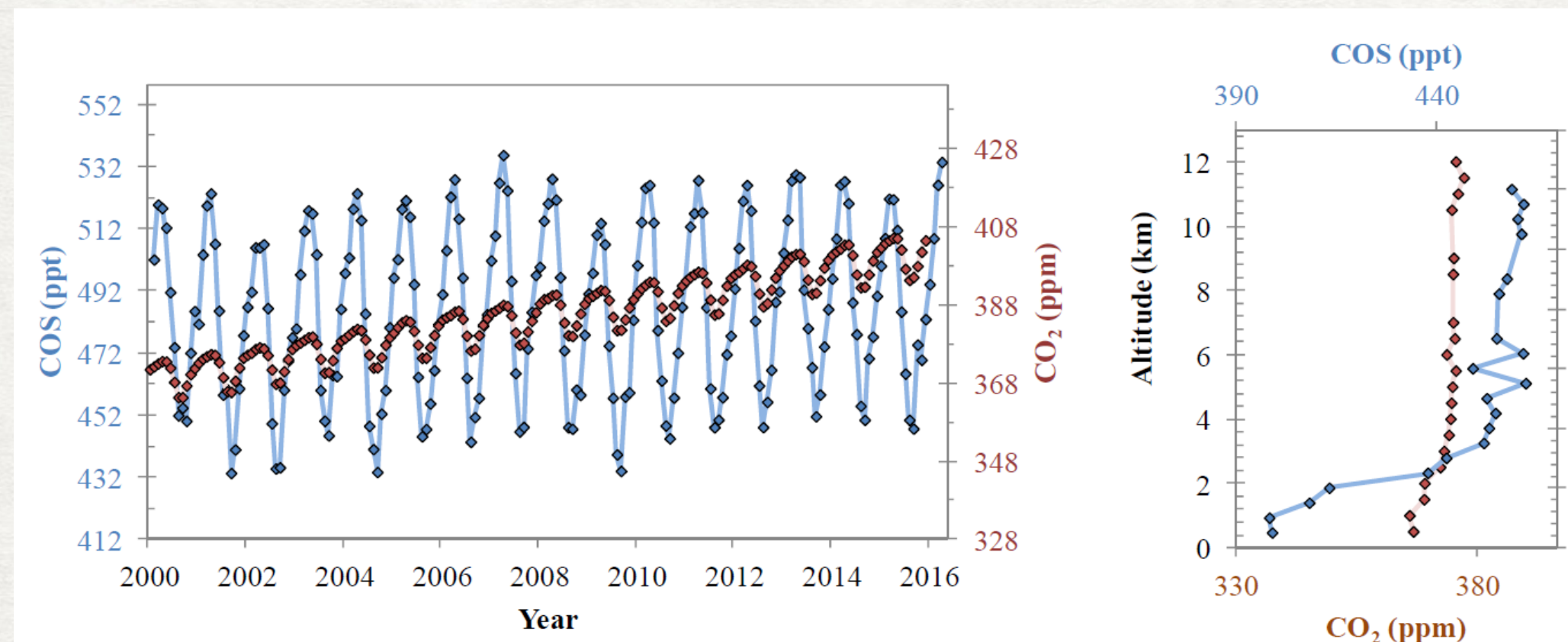


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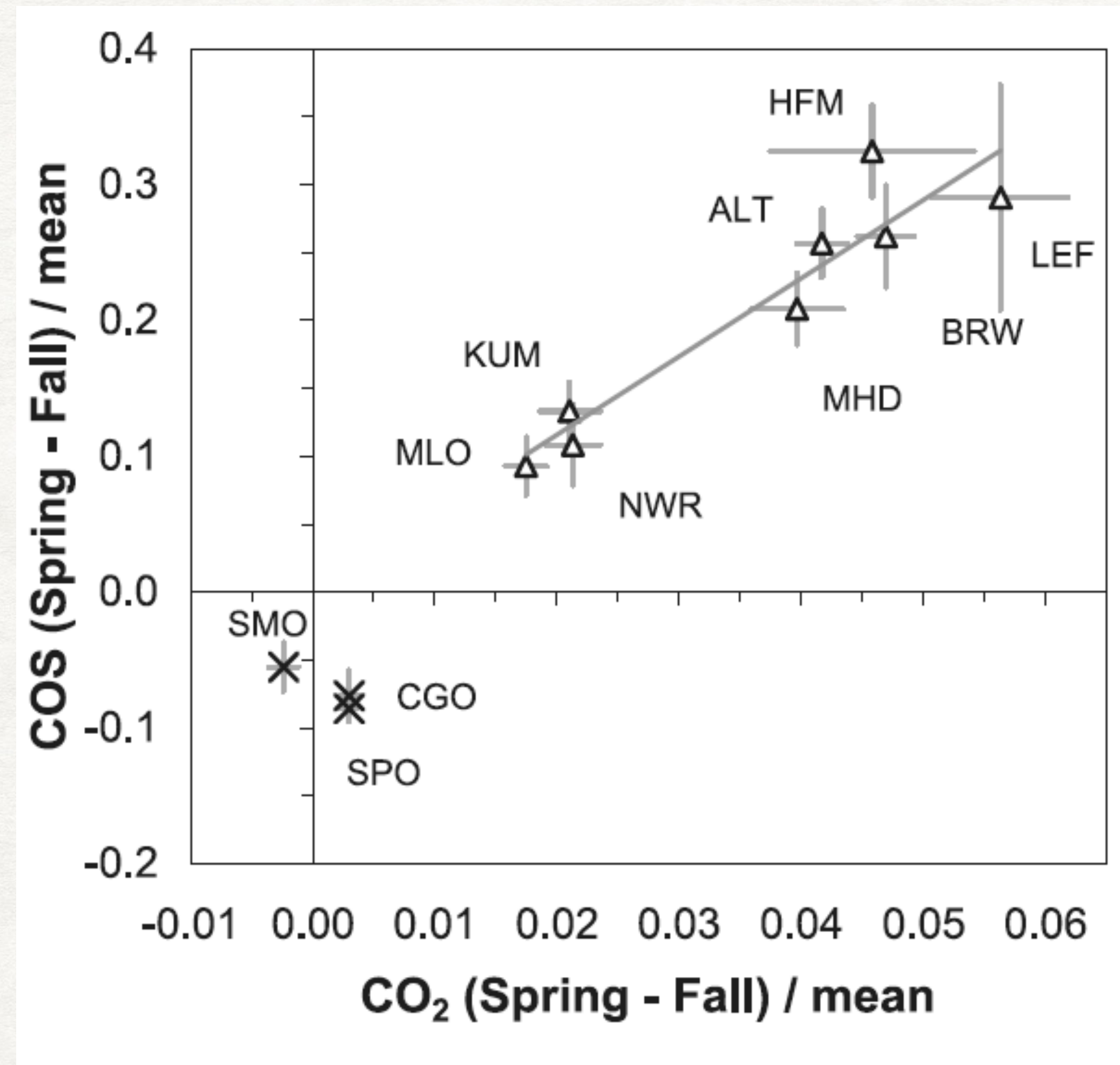
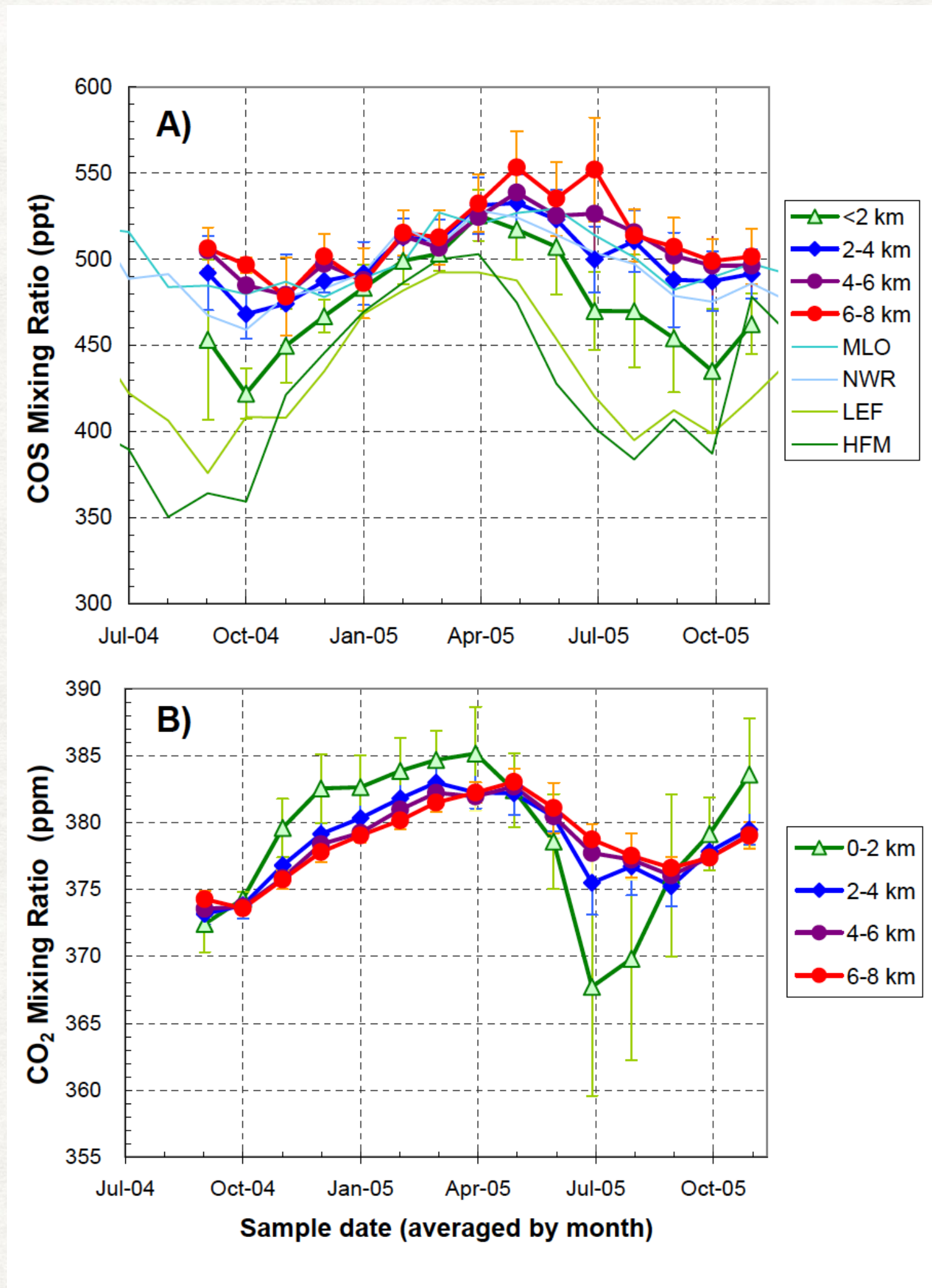
# Atmospheric CO<sub>2</sub> and OCS concentration

## Carbonyl sulfide (COS or OCS)

A new tracer for terrestrial photosynthesis



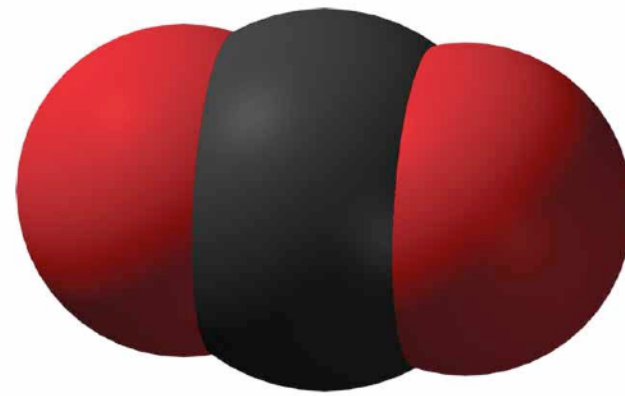
There is strong covariation of CO<sub>2</sub> and OCS in the global atmosphere



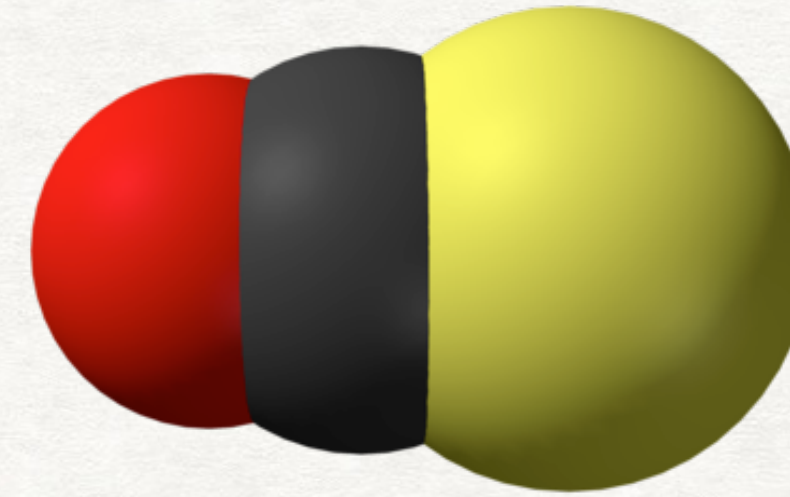
Montzka, S. A., Calvert, P., Hall, B. D., Elkins, J. W., Conway, T. J., Tans, P. P., & Sweeney, C. (2007). On the global distribution, seasonality, and budget of atmospheric carbonyl sulfide (COS) and some similarities to CO<sub>2</sub>. *Journal of Geophysical Research*, 112(D9), 1–15. <http://doi.org/10.1029/2006JD007665>

## Properties

CO<sub>2</sub>

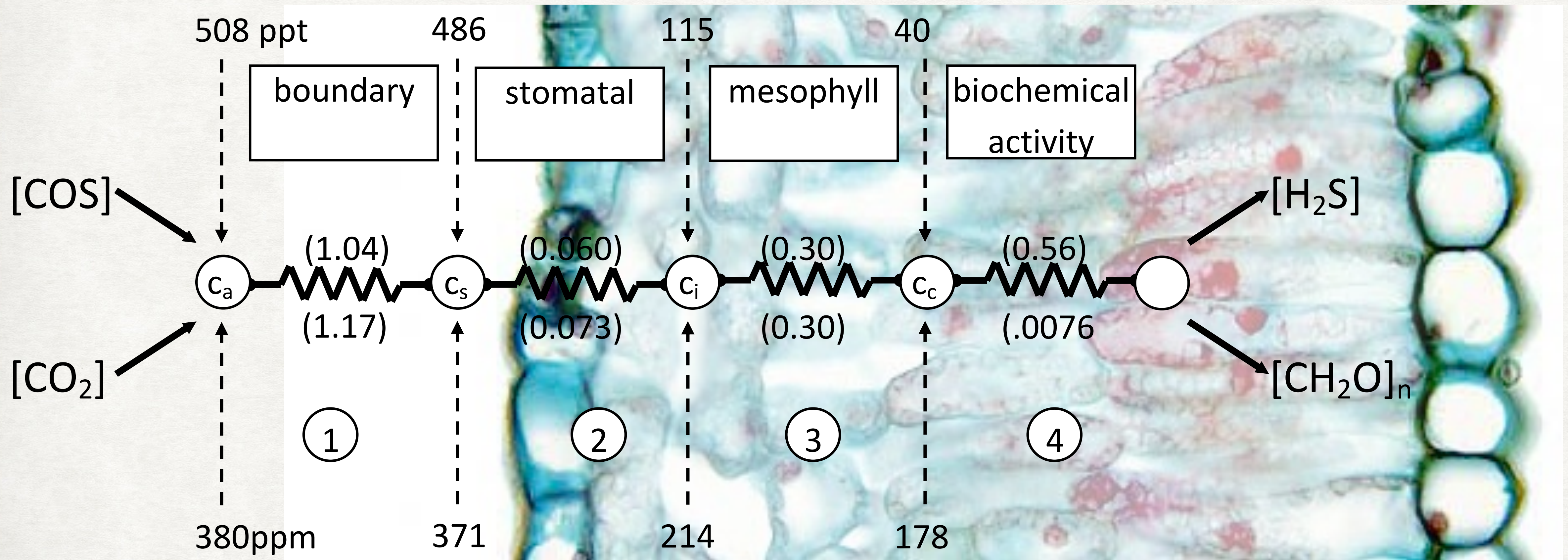


OCS or COS

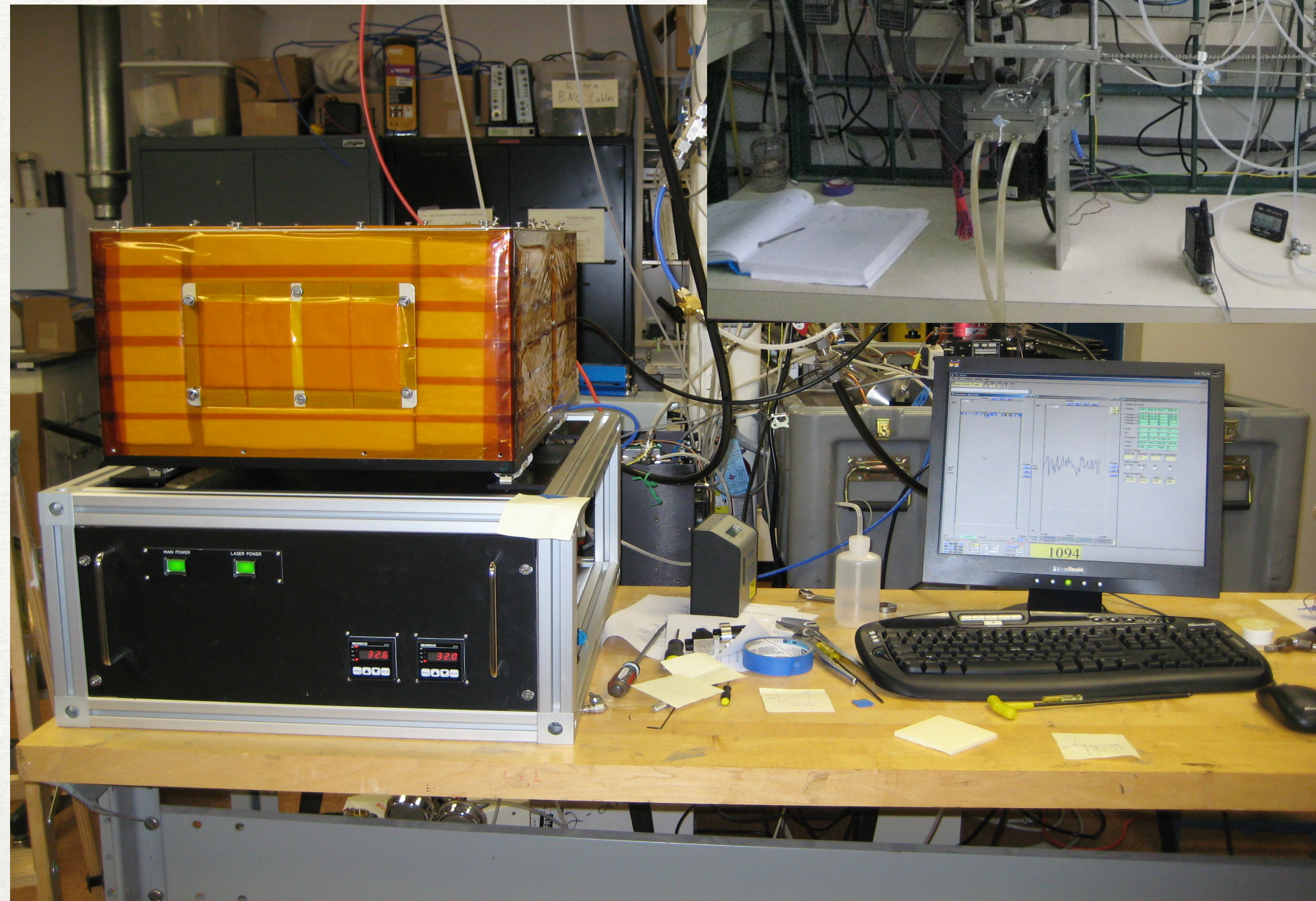


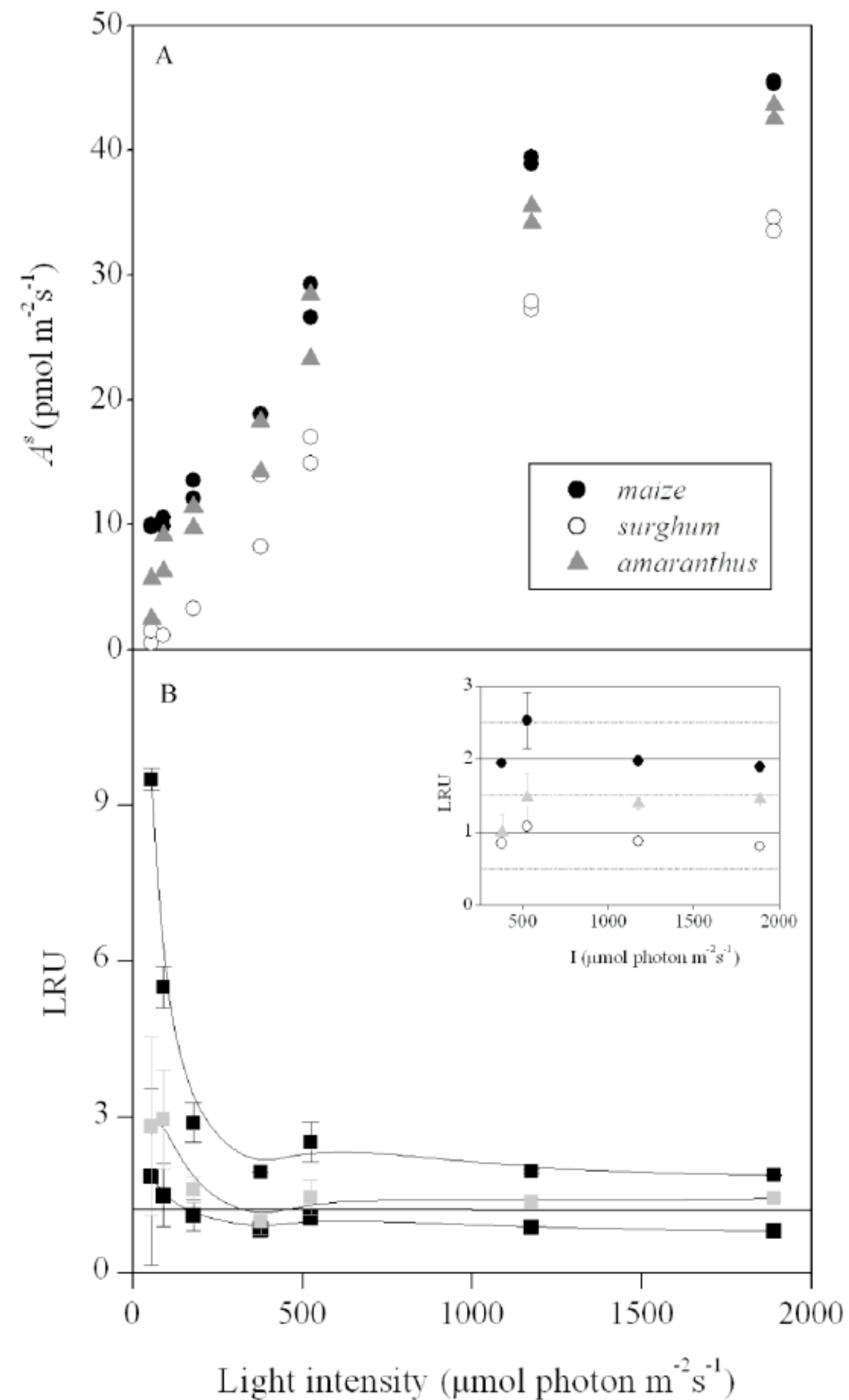
atmospheric concentration	400 ppm	500 ppt
turnover time	~7 years	~2 years
net biosphere exchange (terrestrial)	weak uptake	strong uptake
key enzymes	Rubisco + respiration	Carbonic-anhydrase

# Leaf Uptake OCS follows the same path as CO<sub>2</sub>



Keren Stimler and Dan Yakir of the Weizmann Inst. have conducted gas exchange studies on single leaves with a QCL spectrometer.





Uptake of both CO<sub>2</sub> and COS is stimulated by light. In the case of CO<sub>2</sub> this is expected because synthesis of the CO<sub>2</sub> acceptor, RuBP requires light. No energy is required for hydrolysis of COS.

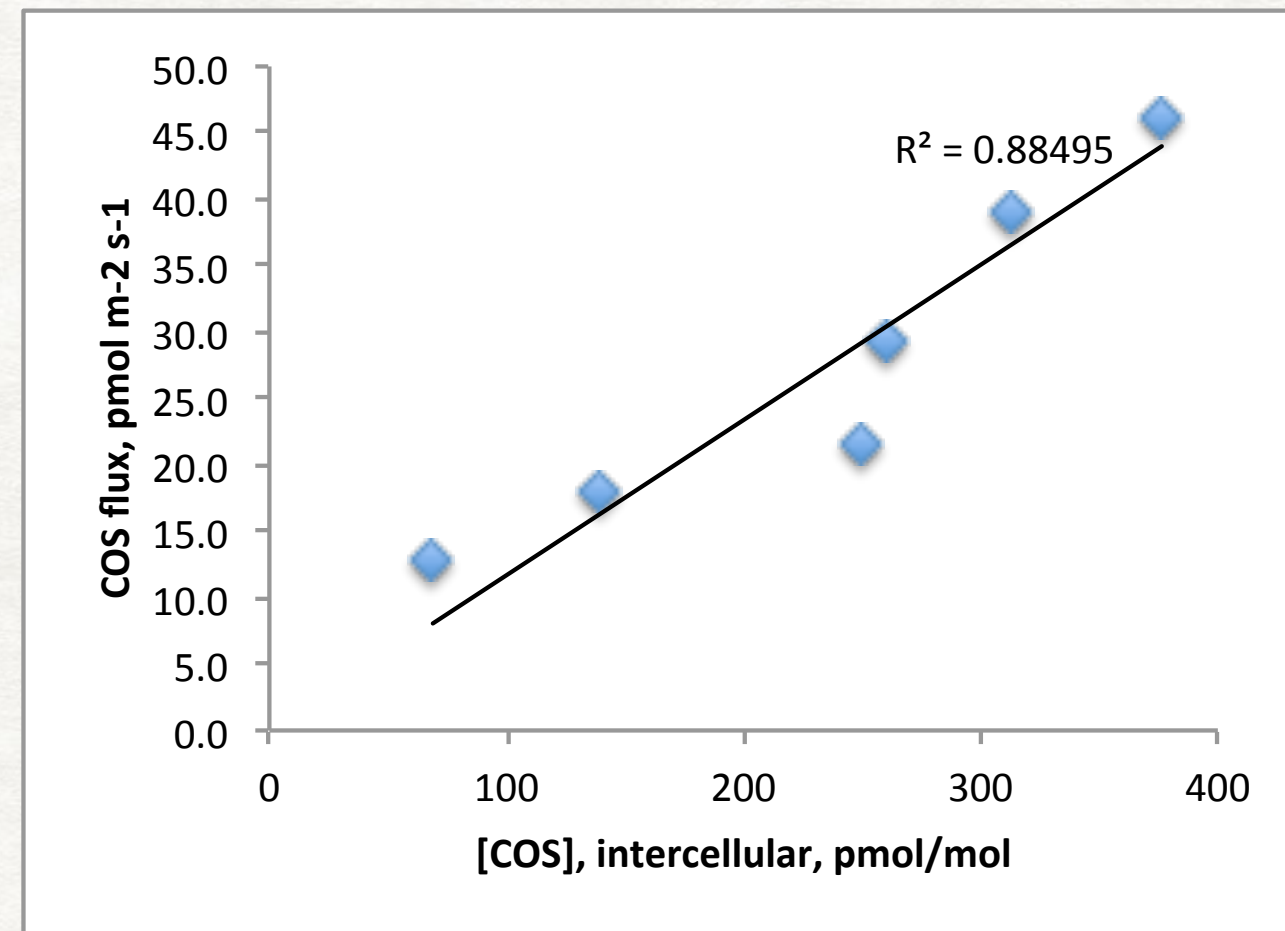
Uptake of OCS is largely controlled by stomatal conductance ( $g_{sw}$ ) which is linked to photosynthesis ( $J_{CO_2}$ ).

$$g_{sw} = m \cdot J_{CO_2} \cdot \frac{[H_2O]_v}{[CO_2]} + b$$

The intercept term ( $b$ ) becomes important at low light.

## Coding it into a model

$$J_{\text{COS}} = [\text{COS}] \cdot \left( \frac{1.55}{g_{bw}} + \frac{1.92}{g_{sw}} + \frac{1}{g_{\text{cell}}} \right)^{-1}$$



Uptake of COS is linear on [COS]

$$g_{\text{cell}}(\text{COS}) = f(\text{diffusion, biochemistry})$$

$$g_{\text{cell}}(\text{COS}) = v_m (g_{i3} \cdot C_3 + g_{i4} \cdot C_4)$$

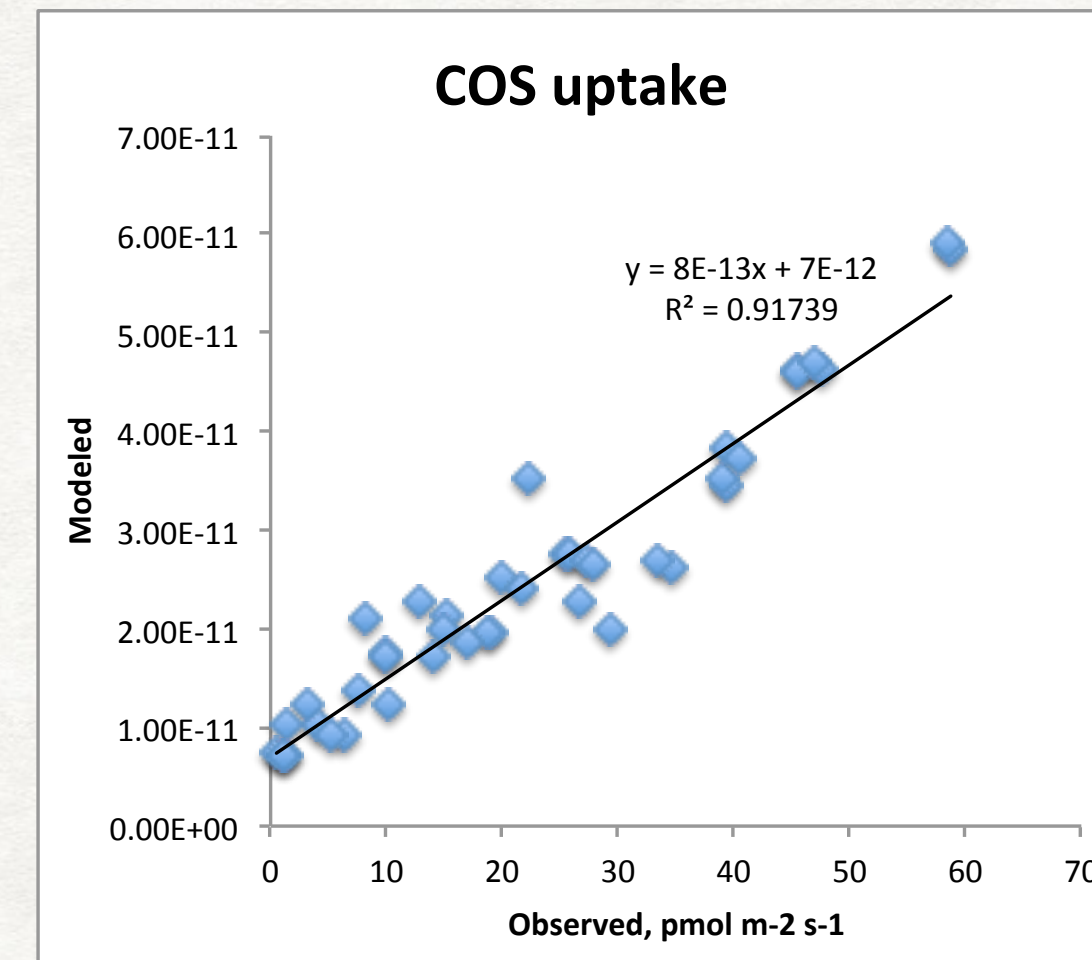
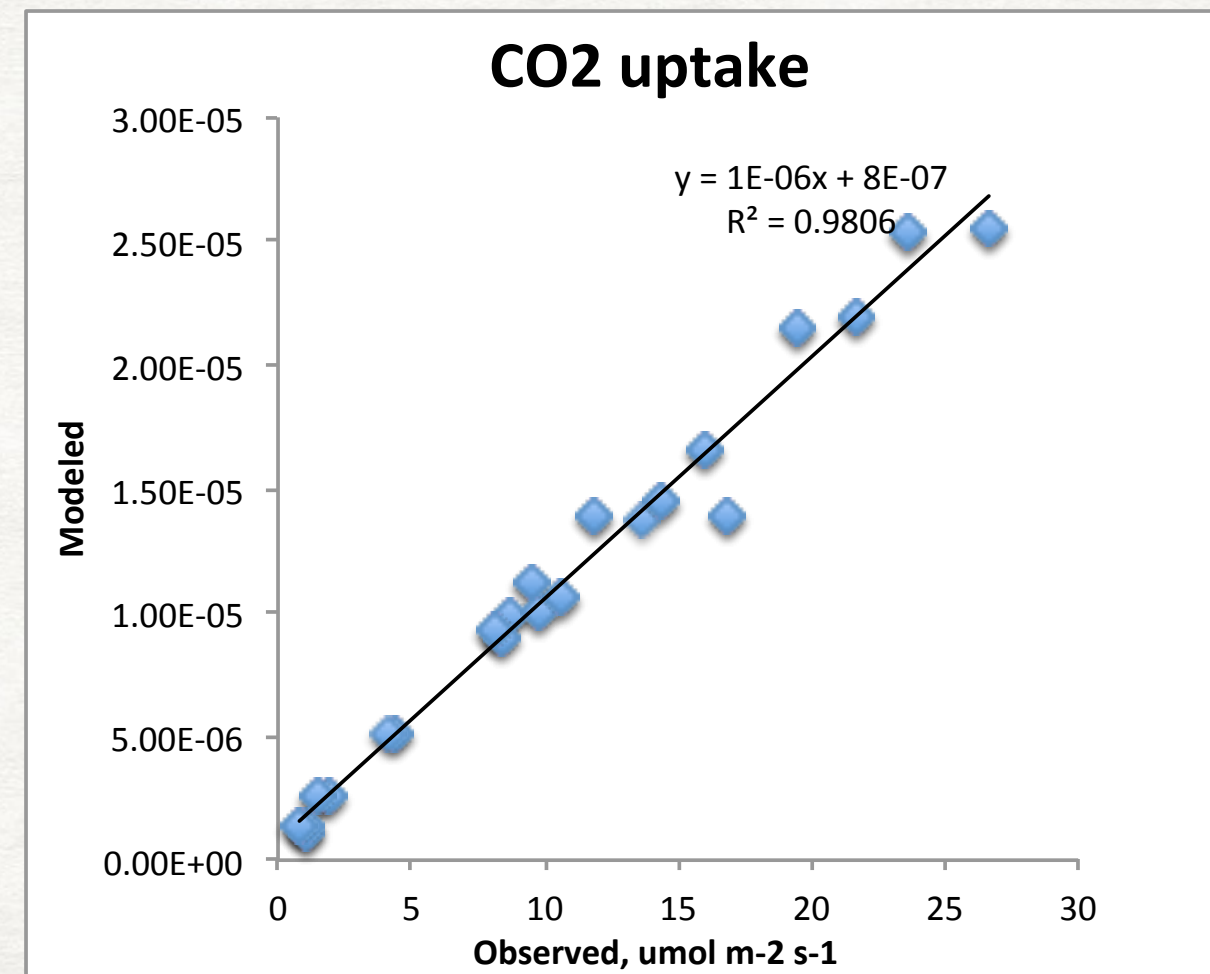
scaling factors

Rubisco activity,  $f(T, \text{stress})$

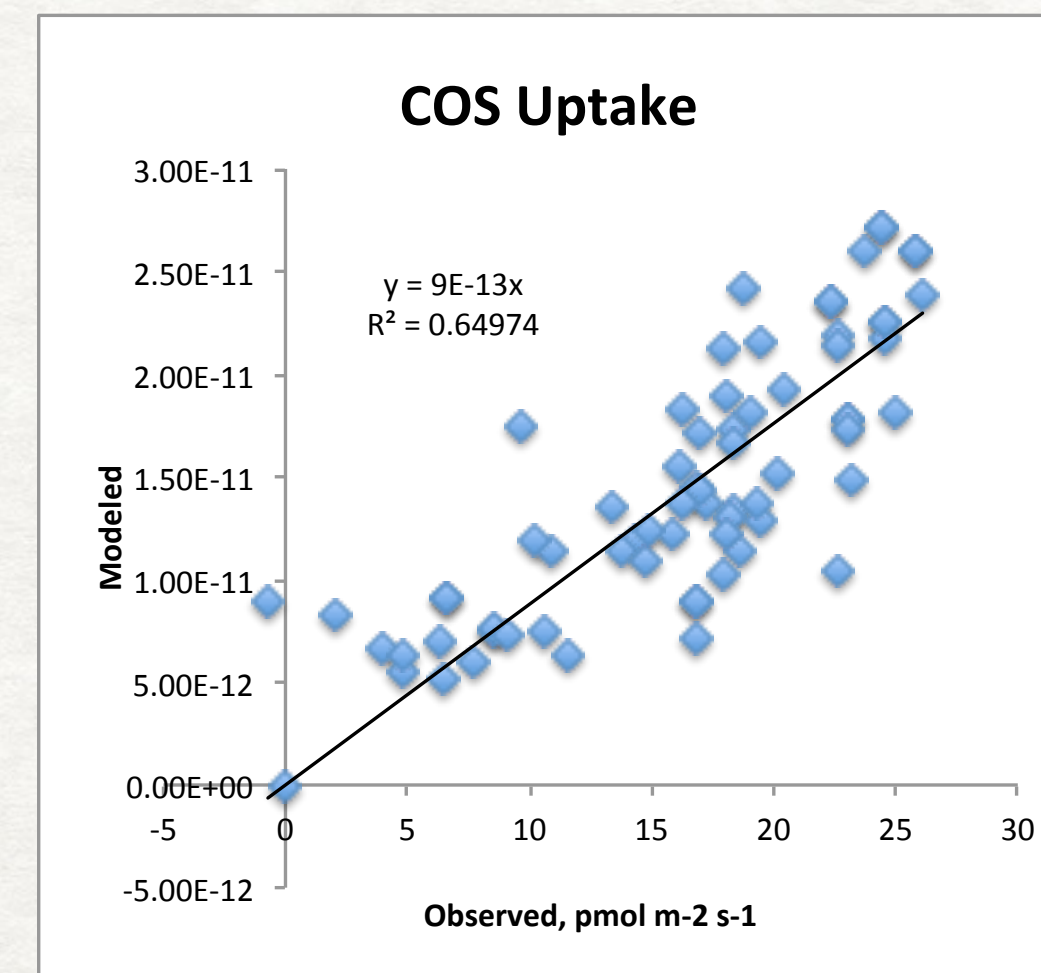
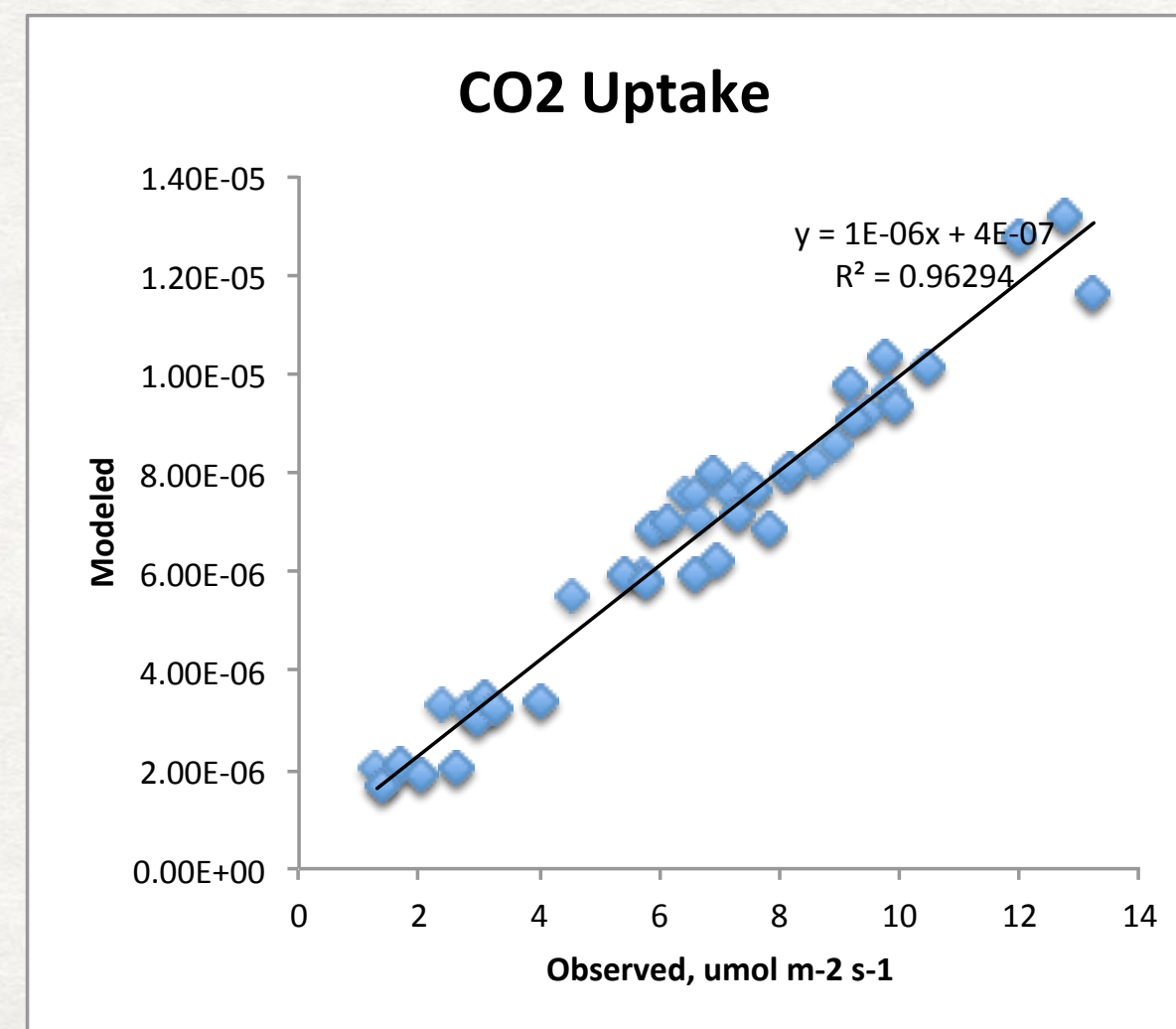
logical



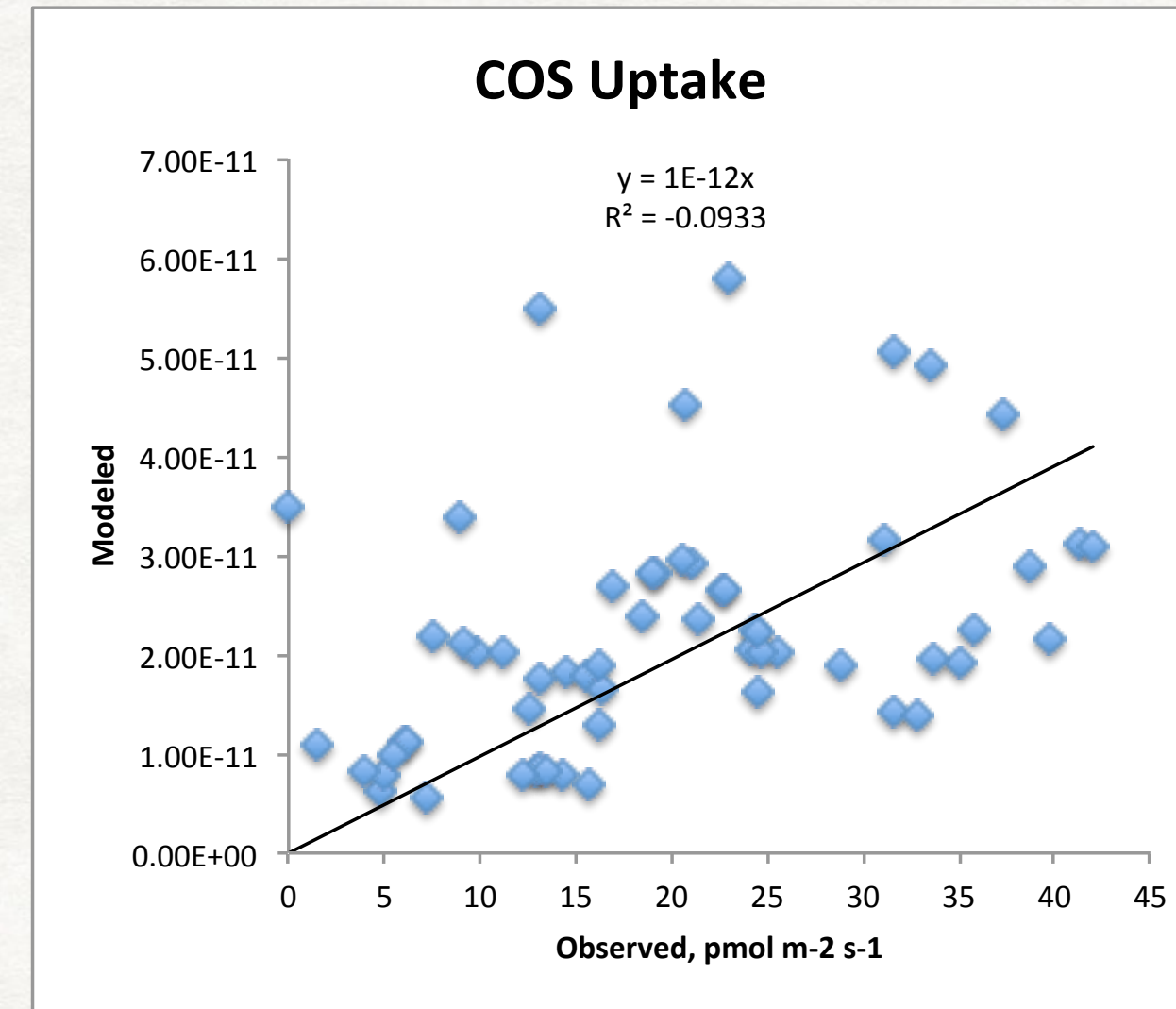
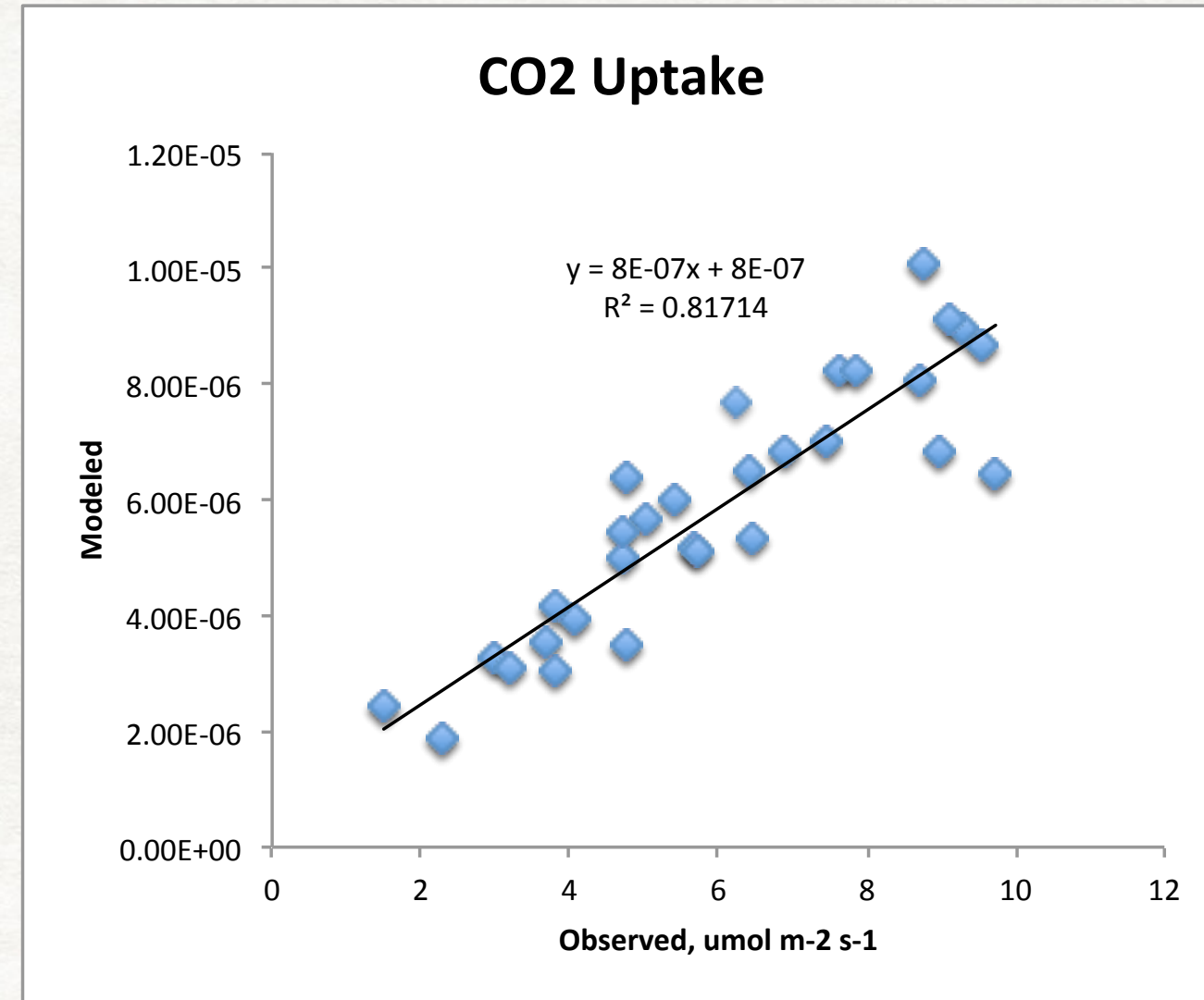
## C<sub>4</sub> Light Response



## C<sub>3</sub> Light Response



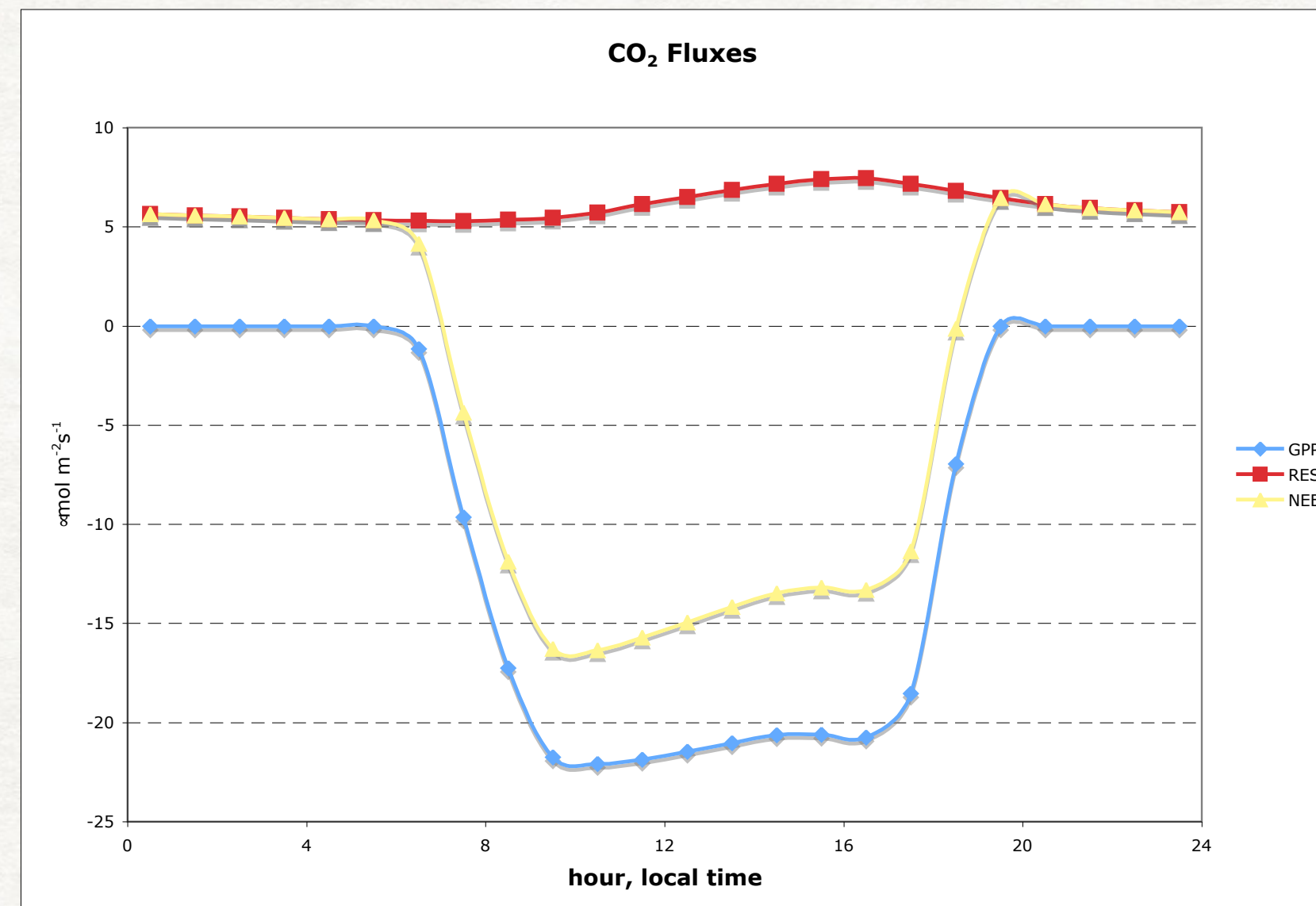
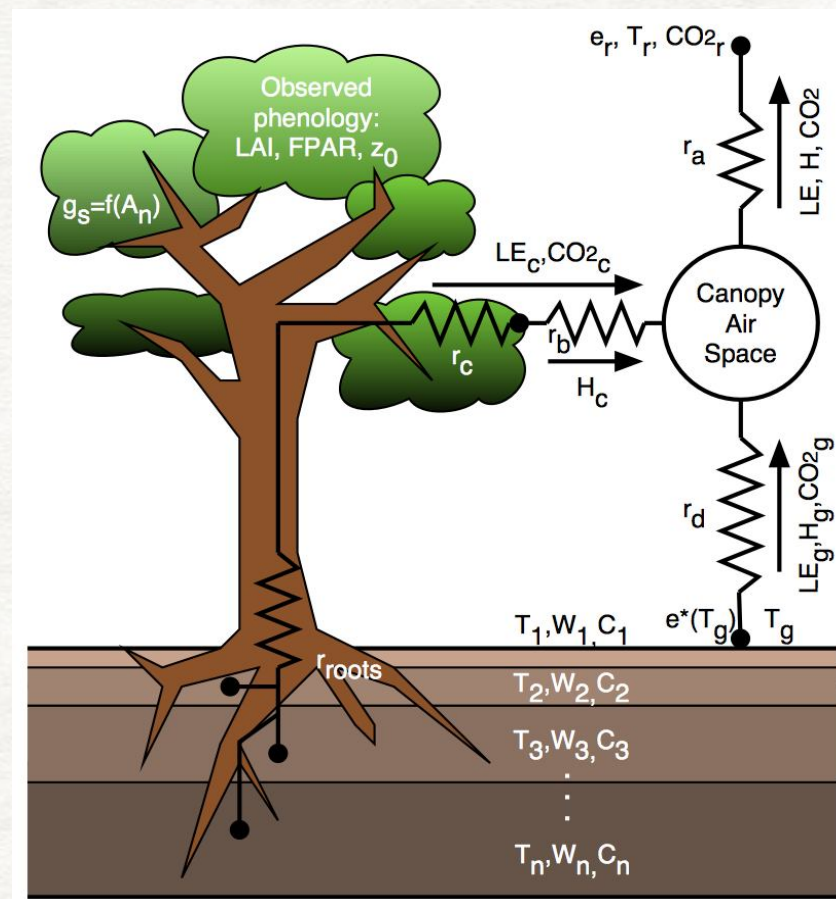
## C<sub>3</sub> Temperature Response



### Summary:

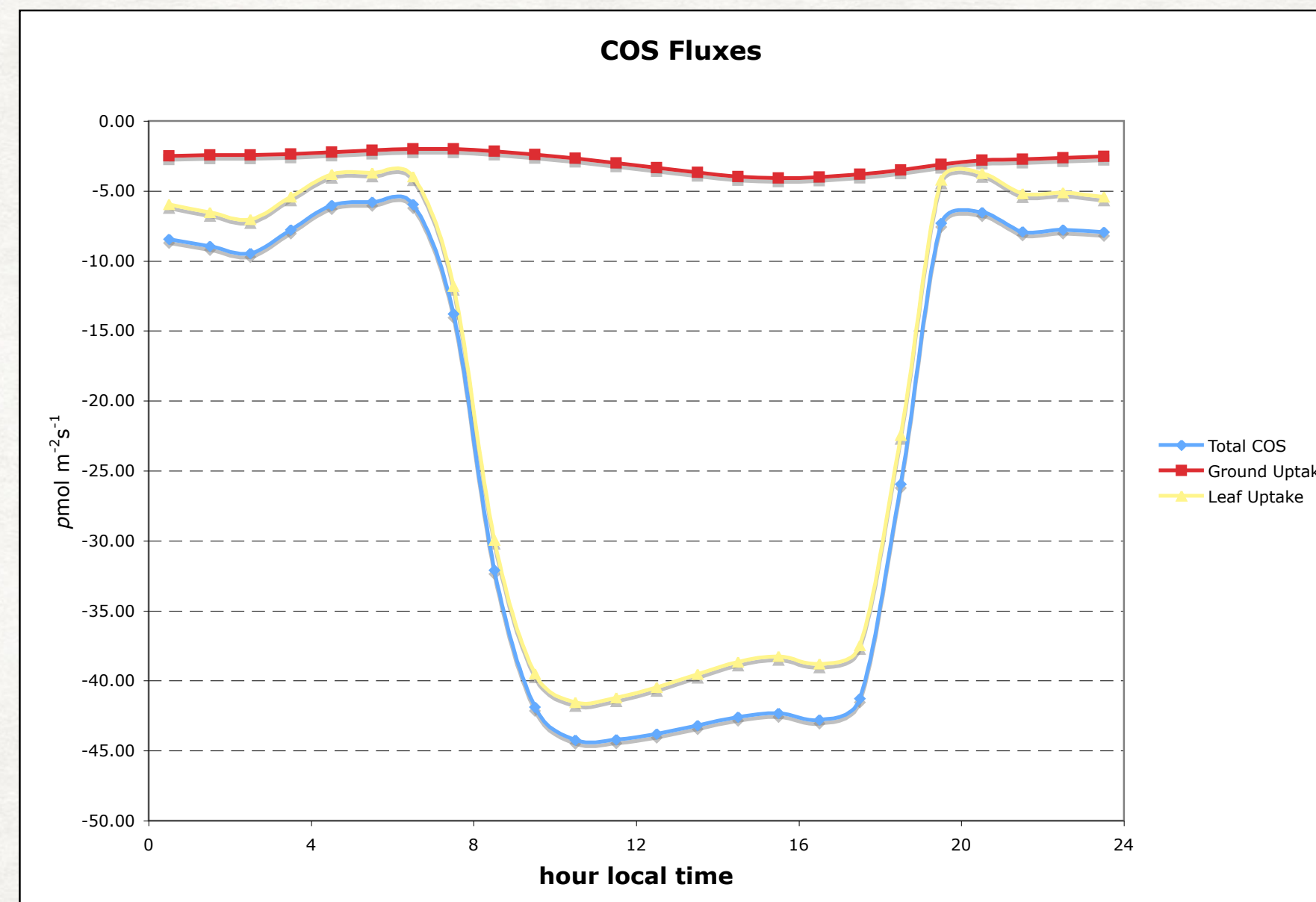
- CO<sub>2</sub> uptake was modeled with a fitted  $V_{\text{max}}$  for each leaf - no other adjustments.
- COS uptake was modeled using that  $V_{\text{max}}$  with additional adjustments to the scaling factors,  $gi3$  or  $gi4$ .
- These differed from species to species by at least a factor of 3 - presumably due to differences in the ratio of carbonic anhydrase to Rubisco.
- Much of the noise is due to inaccuracy in modeling  $gsw$ .

# Diurnal Patterns of CO<sub>2</sub> and OCS Exchange

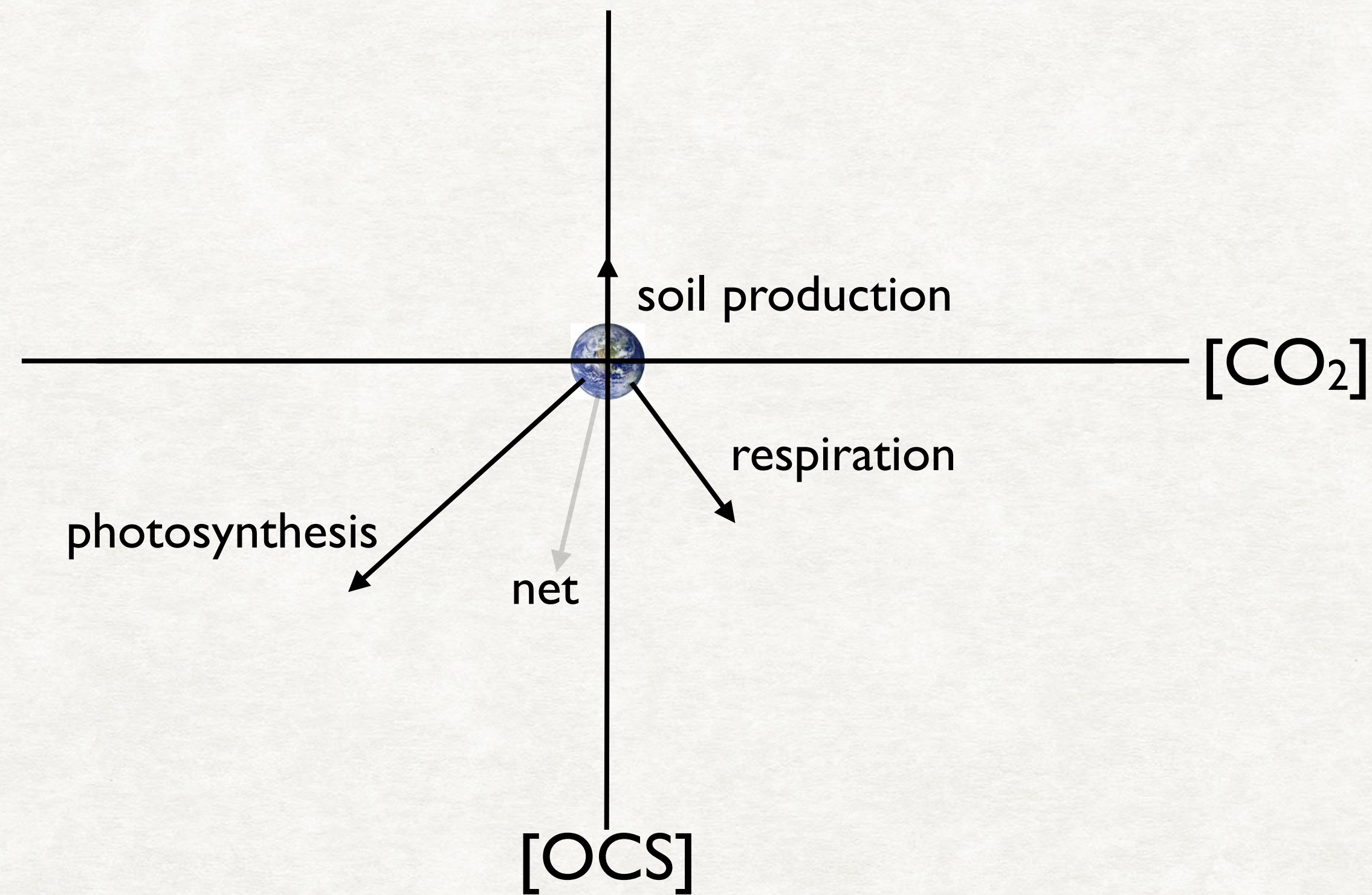


Night air is different than day air.

	CO <sub>2</sub>	OCS
day	↓	↓
night	↑	↓

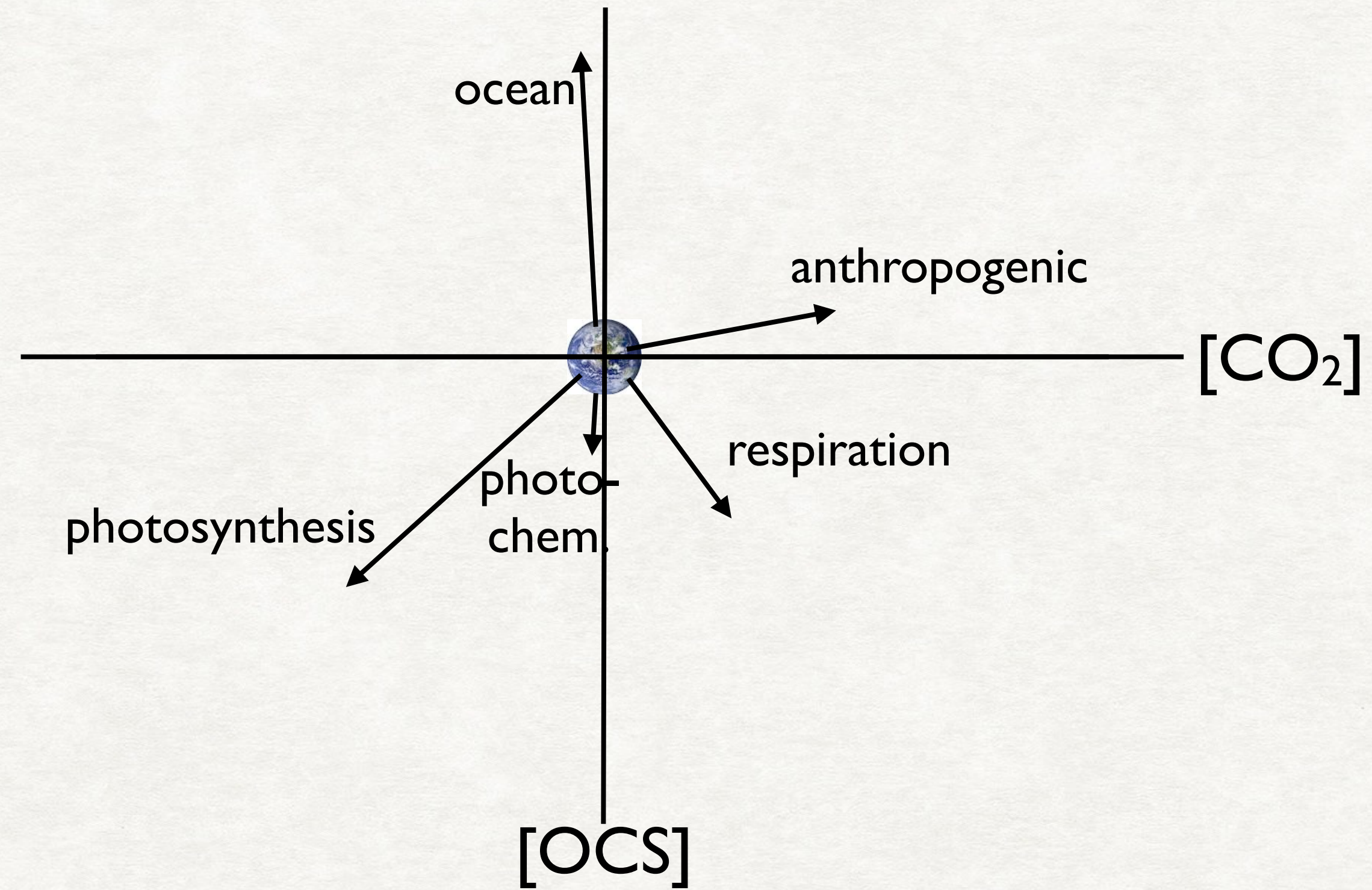


Exchange processes “pull” the atmosphere in different directions in CO<sub>2</sub> - OCS space



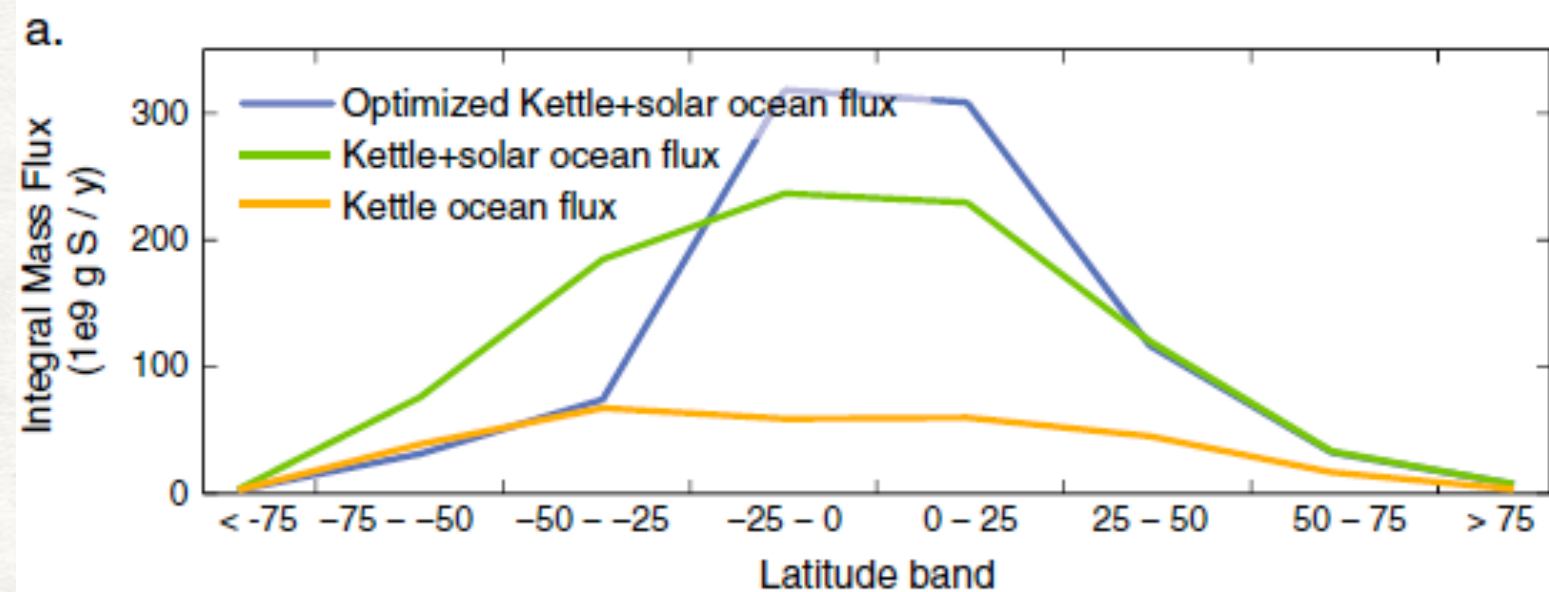
I have only discussed OCS exchange in photosynthesis, respiration and soil production of OCS will be topics of later discussion.

The atmosphere integrates the impact of all exchanges  
(global)



# A coupled model of the global cycles of carbonyl sulfide and CO<sub>2</sub>: A possible new window on the carbon cycle

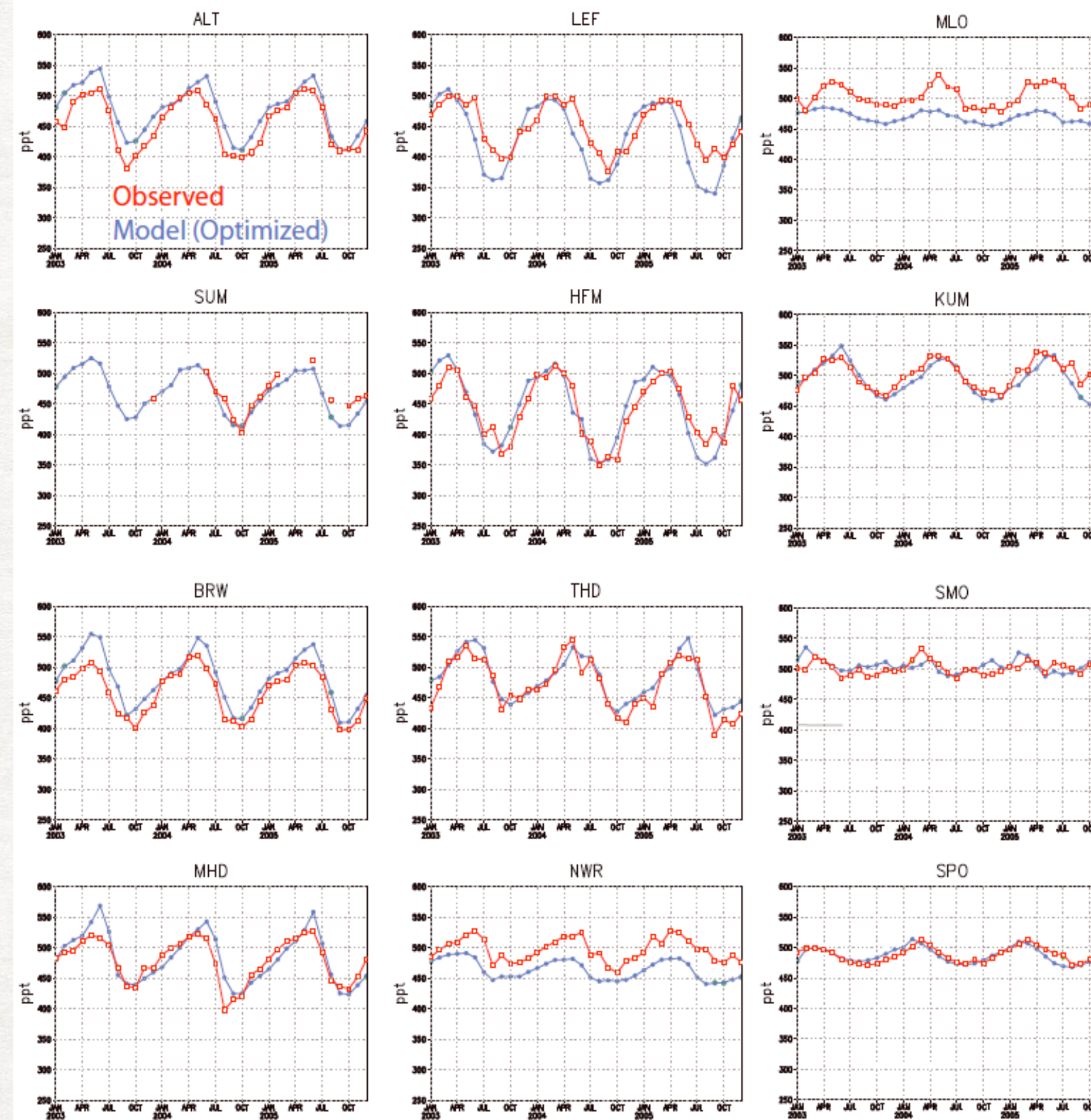
Joe Berry,<sup>1</sup> Adam Wolf,<sup>2</sup> J. Elliott Campbell,<sup>3</sup> Ian Baker,<sup>4</sup> Nicola Blake,<sup>5</sup> Don Blake,<sup>5</sup>  
A. Scott Denning,<sup>4</sup> S. Randy Kawa,<sup>6</sup> Stephen A. Montzka,<sup>7</sup> Ulrike Seibt,<sup>8</sup> Keren Stimler,<sup>9</sup>  
Dan Yakir,<sup>9</sup> and Zhengxin Zhu<sup>6</sup>



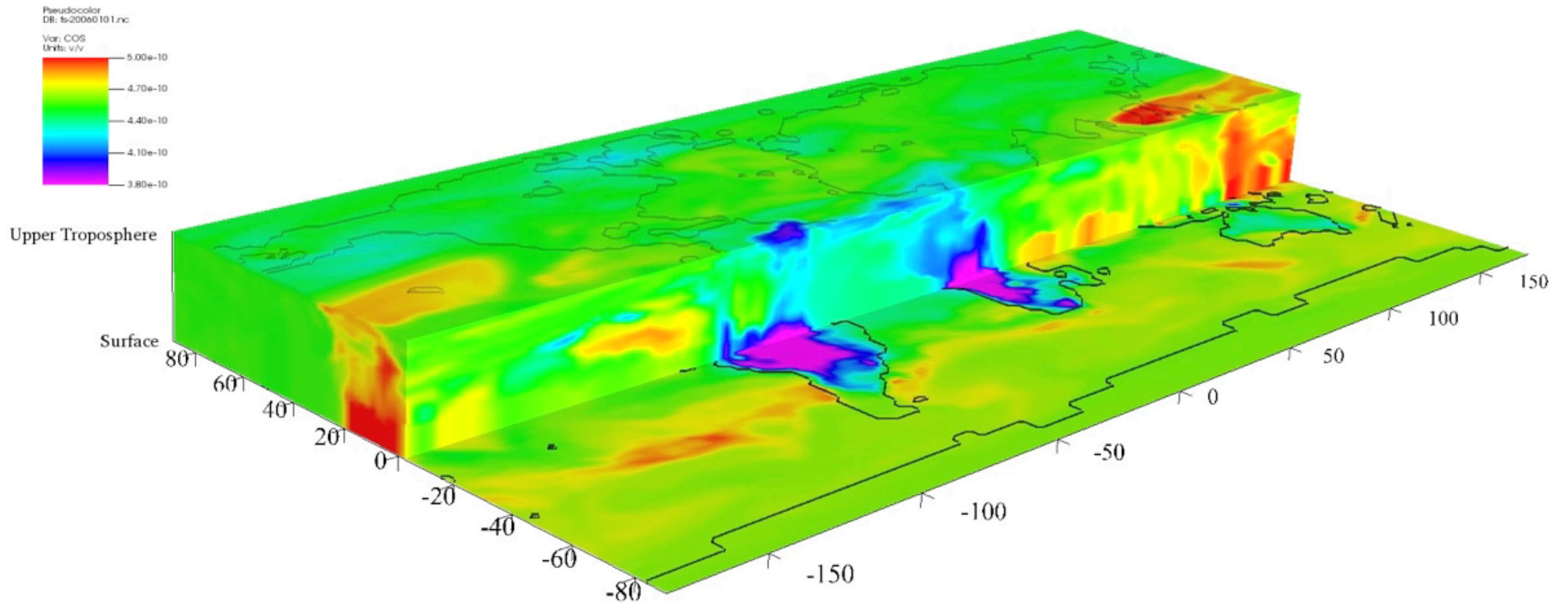
**Table 1.** A Compilation of the Global Sources and Sinks Used for PCTM Simulations of Atmospheric COS<sup>a</sup>

Sources	<i>Kettle et al., 2002</i>	<b>This Study</b>
Direct COS Flux From Oceans	39	<b>39</b>
Indirect COS Flux as DMS From Oceans	81	<b>81</b>
Indirect COS Flux as CS <sub>2</sub> From Oceans	156	<b>156</b>
Direct Anthropogenic Flux	64	<b>64</b>
Indirect Anthropogenic Flux From CS <sub>2</sub>	116	<b>116</b>
Indirect Anthropogenic Flux From DMS	0.5	<b>0.5</b>
Biomass Burning	11	<b>136</b>
Additional (Photochemical) Ocean Flux		<b>600</b>
<i>Sinks</i>		
Destruction by OH Radical	-94	<b>-101</b>
Uptake by Canopy	-238	<b>-738</b>
Uptake by Soil	-130	<b>-355</b>
Net Total	-5	<b>-2.5</b>

<sup>a</sup>Units are  $1.0 \times 10^9$  g of sulfur. Fluxes changed in this study are highlighted with bold type.



# [OCS] vertical slice at Equator



Jim Stineciper and Elliott Campbell (unpublished)

## Conclusions:

- COS has potential to help estimate GPP and by difference Respiration at site-, regional-, and global-scales.
- COS should be highly correlated with solar induced fluorescence.
- Our work has led to a substantial revisions of the global budget of COS.
- We posit the existence of a large source in the tropical oceans. There is satellite evidence to support this. No *in situ* studies of mechanism.
- Models of soil uptake, soil production, anthropogenic production and ocean production (at least) are needed to complete the cycle.
- Inclusion of COS in data assimilation systems may help to understand the basis of inferred changes in net CO<sub>2</sub> exchange over the continents.



