

A world map with a color-coded overlay representing carbon cycle data. The colors range from red (high values) to blue (low values), with green and yellow in between. The map is centered on the Atlantic Ocean.

# Integrating remote sensing with ecosystem modeling at multiple scales

NASA Carbon Cycles  
and Ecosystems Meeting  
Univ. of Maryland

**August 23 2006**

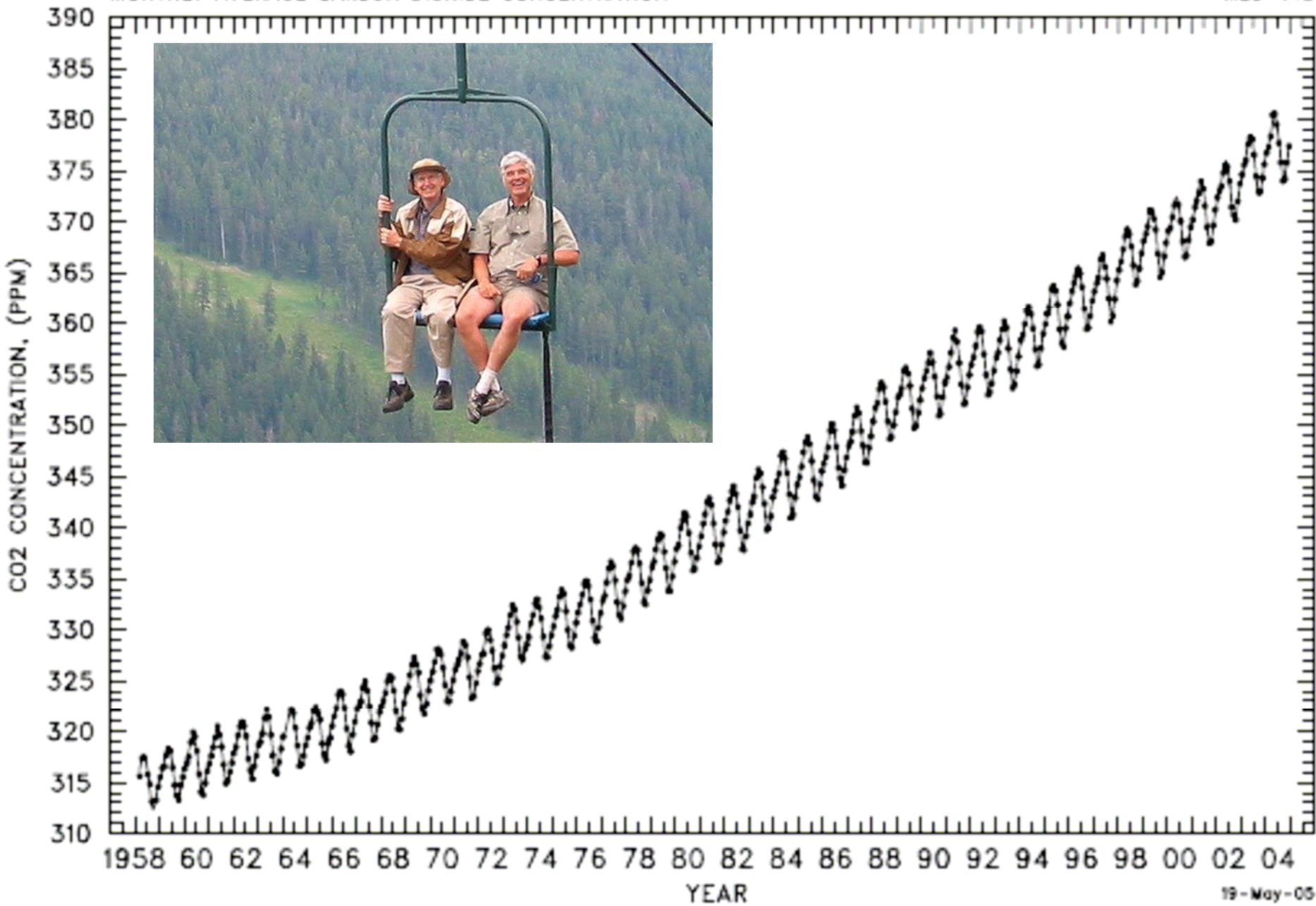
**Steven W. Running**

**University of Montana**

**Missoula, MT. USA**

MAUNA LOA OBSERVATORY, HAWAII  
MONTHLY AVERAGE CARBON DIOXIDE CONCENTRATION

MLO-145







JULY 1982 GREEN LEAF DENS



# Driving ecosystem models with satellite data, concept for NASA Global Habitability, 1983

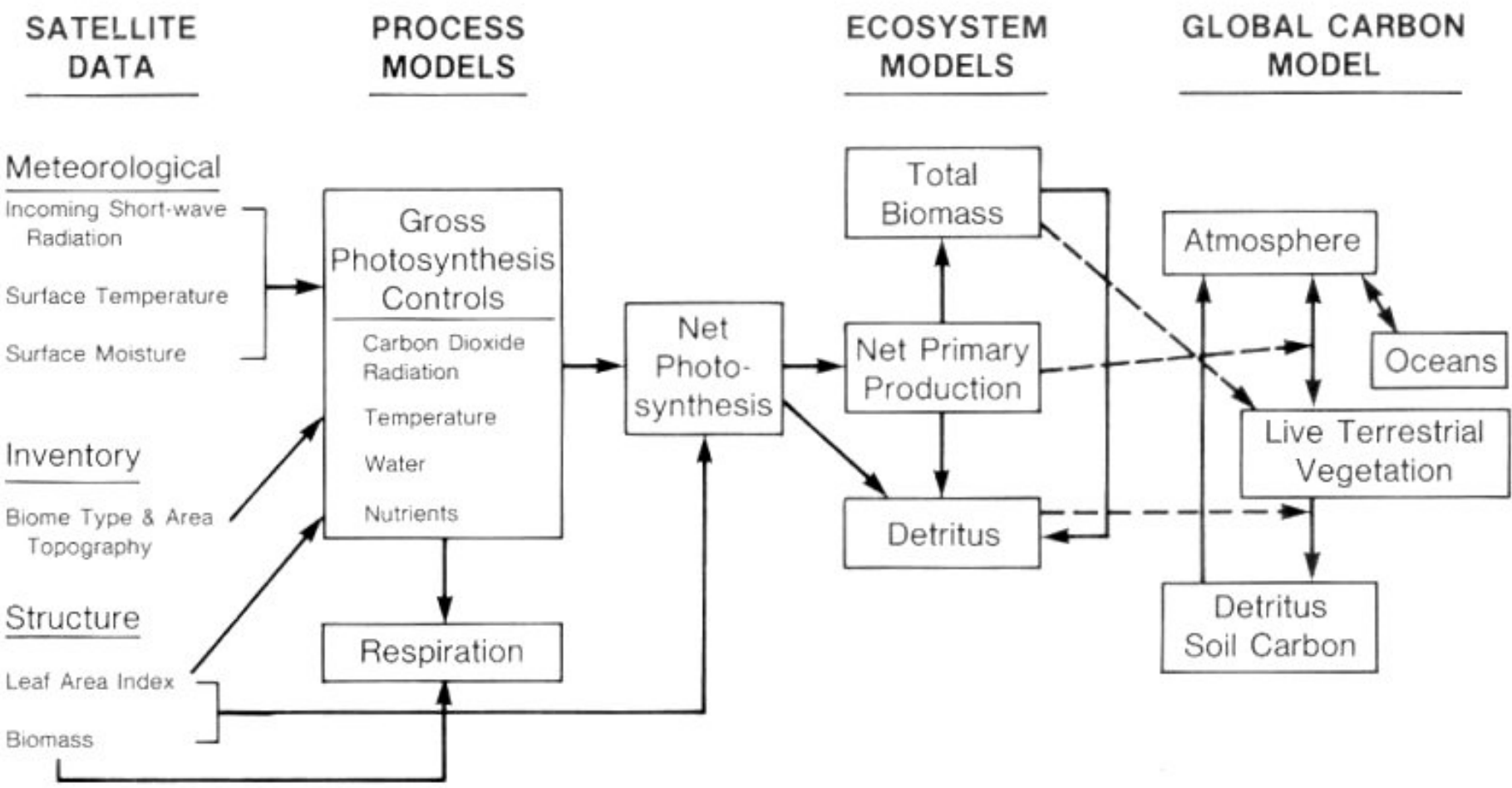
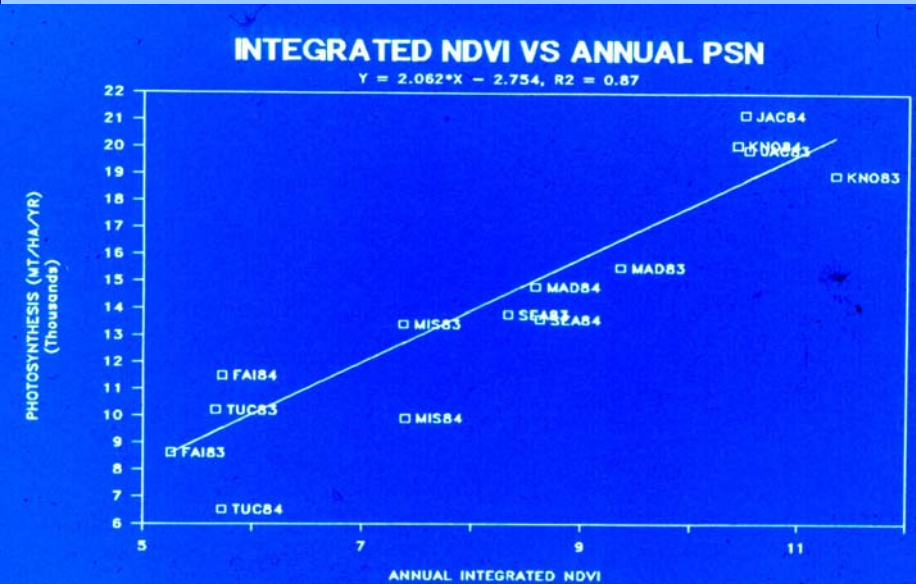
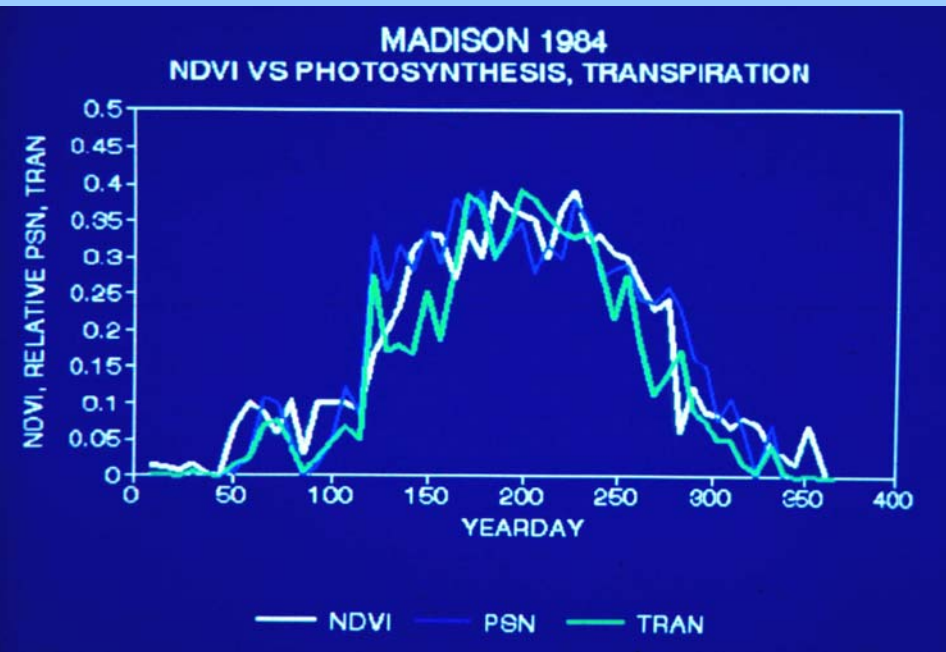


Figure 2. Organizational diagram of a proposed model of net primary production for a coniferous forest. All driving variables are derived from satellite data. Potential linkages to a global carbon model are shown by dashed lines (Running, 1984).

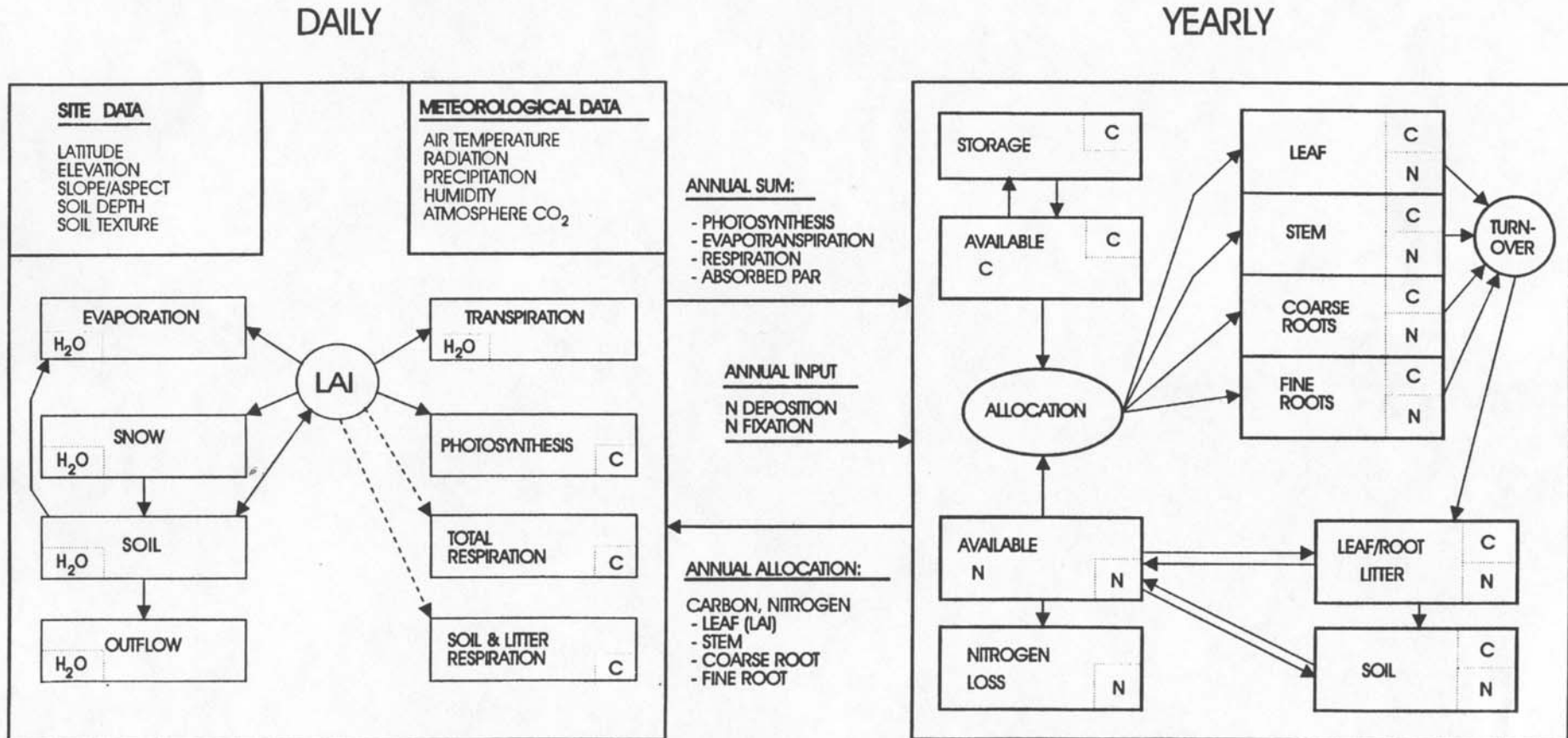


# NDVI Related to Photosynthesis



- Running and Nemani 1988

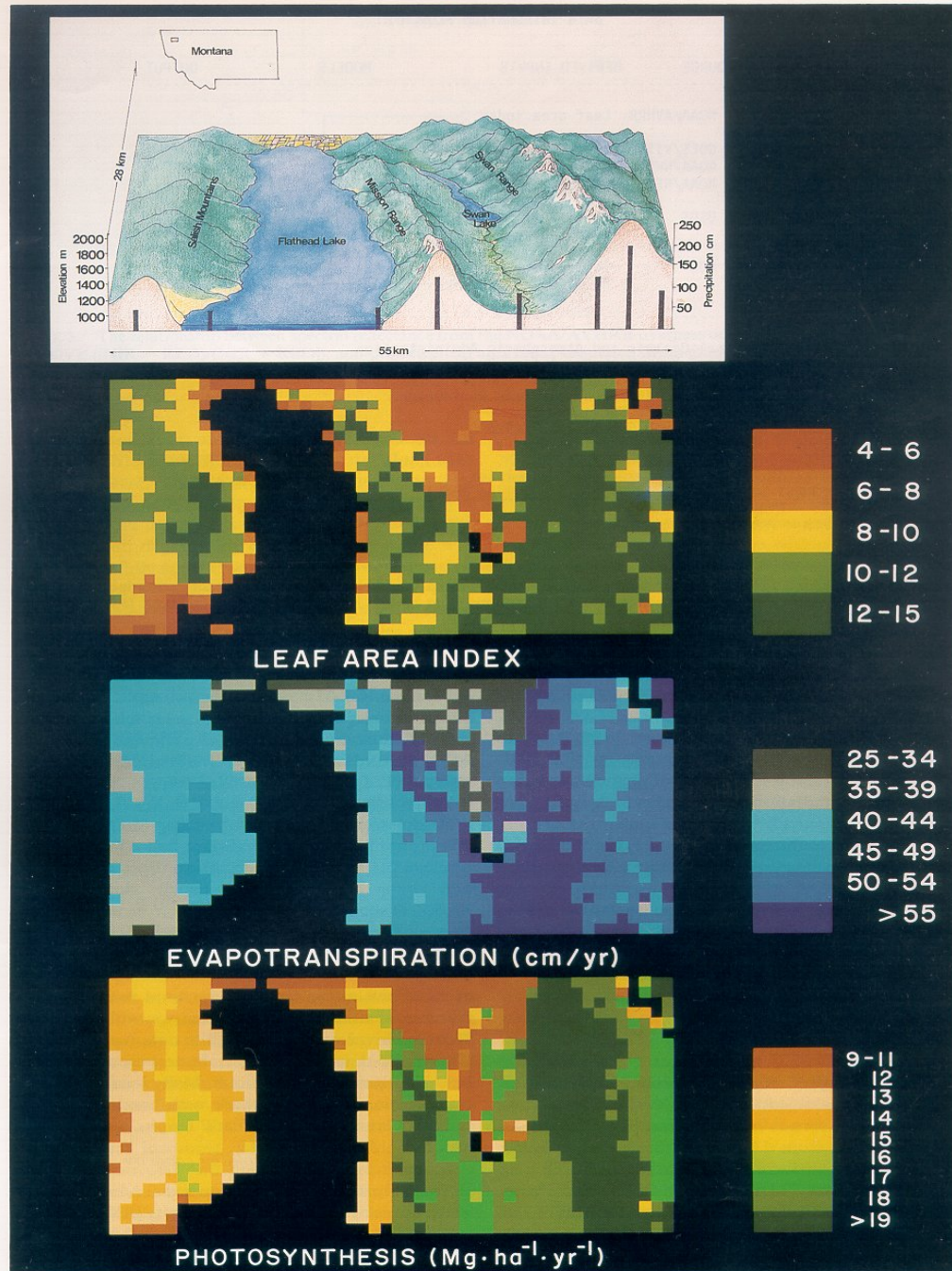
# Original FOREST-BGC flow diagram, emphasizing dual time steps, critical role of LAI, C-H<sub>2</sub>O-N interactions, and remote sensing applications, 1988



**Figure 1.2.** Compartment flow diagram for the FOREST-BGC ecosystem simulation model. This diagram illustrates the state variables of carbon, water, and nitrogen, the critical mass flow linkages, the combined daily and annual time resolution, and the daily meteorological data required for executing the model. The major variables and underlying principles associated with the model were developed specifically for application at multiple time and space scales, and for compatibility with remote-sensed definition of key ecosystem properties.

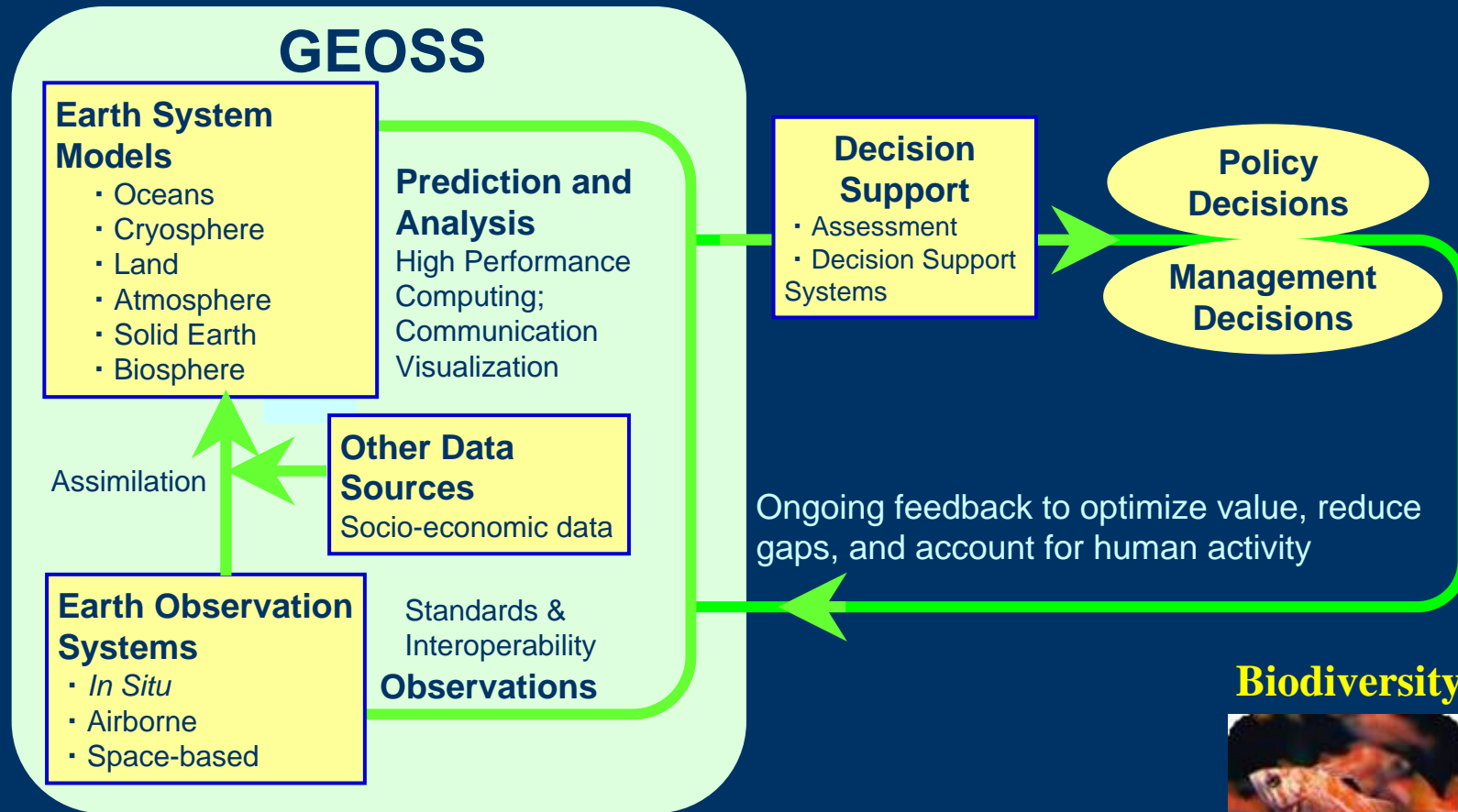


# First? spatial ecosystem model driven by remote sensing

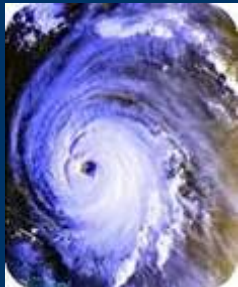


# GEOSS

(Global Earth Observation System of Systems)



## Disasters



## Biodiversity



## 9 Societal Benefit Areas

Health

Energy

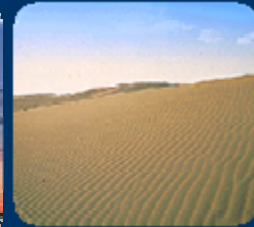
Climate

Water

Weather

Ecosystems

Agriculture

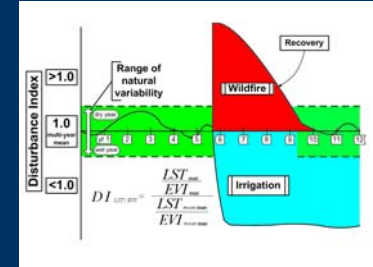
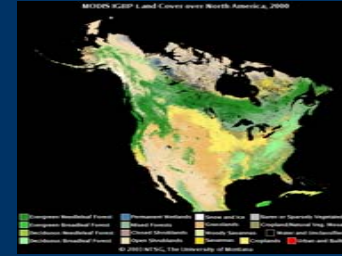




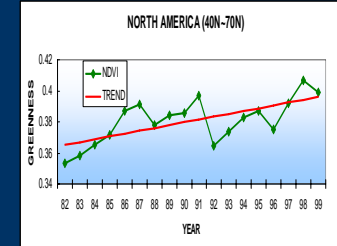
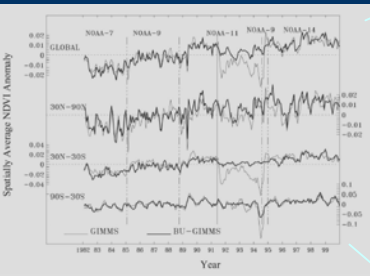
# Terrestrial Carbon Monitor

## SATELITE DATA

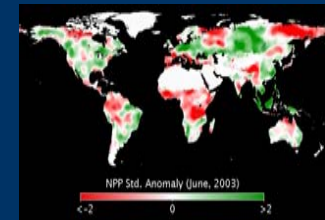
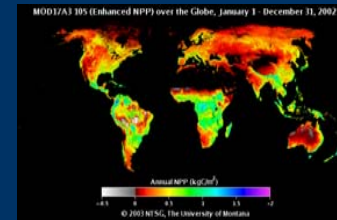
### LANDCOVER



### GROWING SEASON

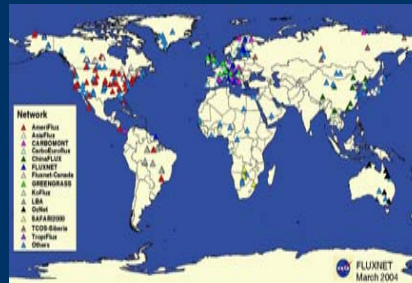
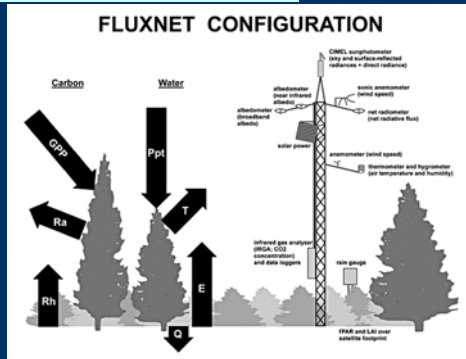


### PRIMARY PRODUCTION

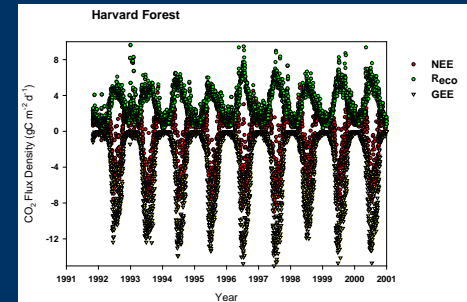


## GROUND DATA

### FLUXNET CONFIGURATION



### Harvard Forest



# DYNAMIC GLOBAL LAND TRANSITIONS

**LANDUSE**  
[Human control]

**LANDCOVER**  
[Biophysically controlled]



**Human Systems**

**HUMAN DECISION MAKING**  
political/economic choices

**Ecological Systems**

- Institutions
- Culture
- Technology
- Population
- Economic

- Biogeochemistry
- Genetic bank
- Water
- Air

**Economic Problems**

- poverty
- unequal wealth
- war
- globalization

**Ecological Problems**

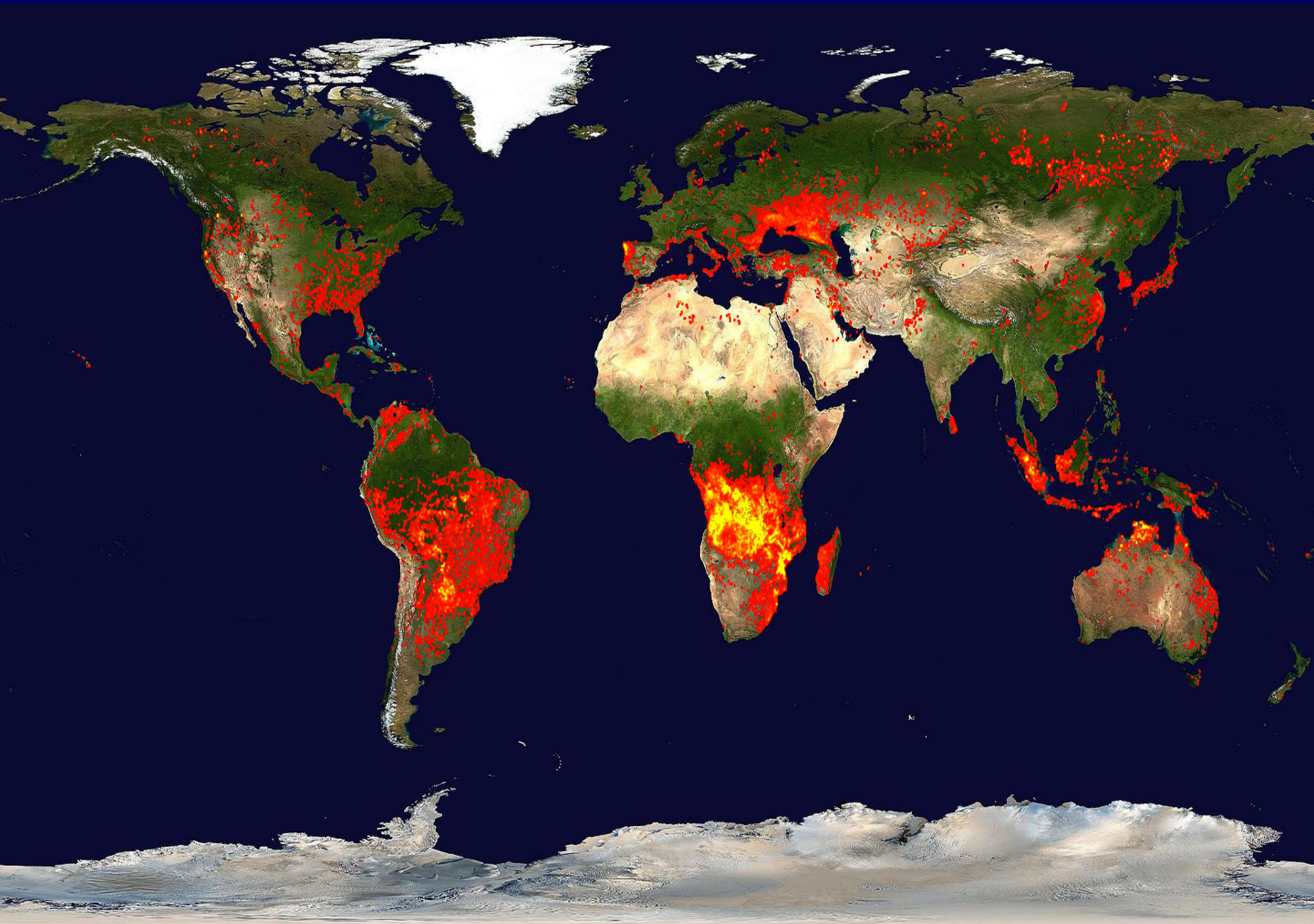
- pollution
- diseases
- food/fibre/fuel shortages
- overcrowding

**Ecosystem goods & services**

- clean air/water
- waste recycling
- food/fibre/fuel
- recreation

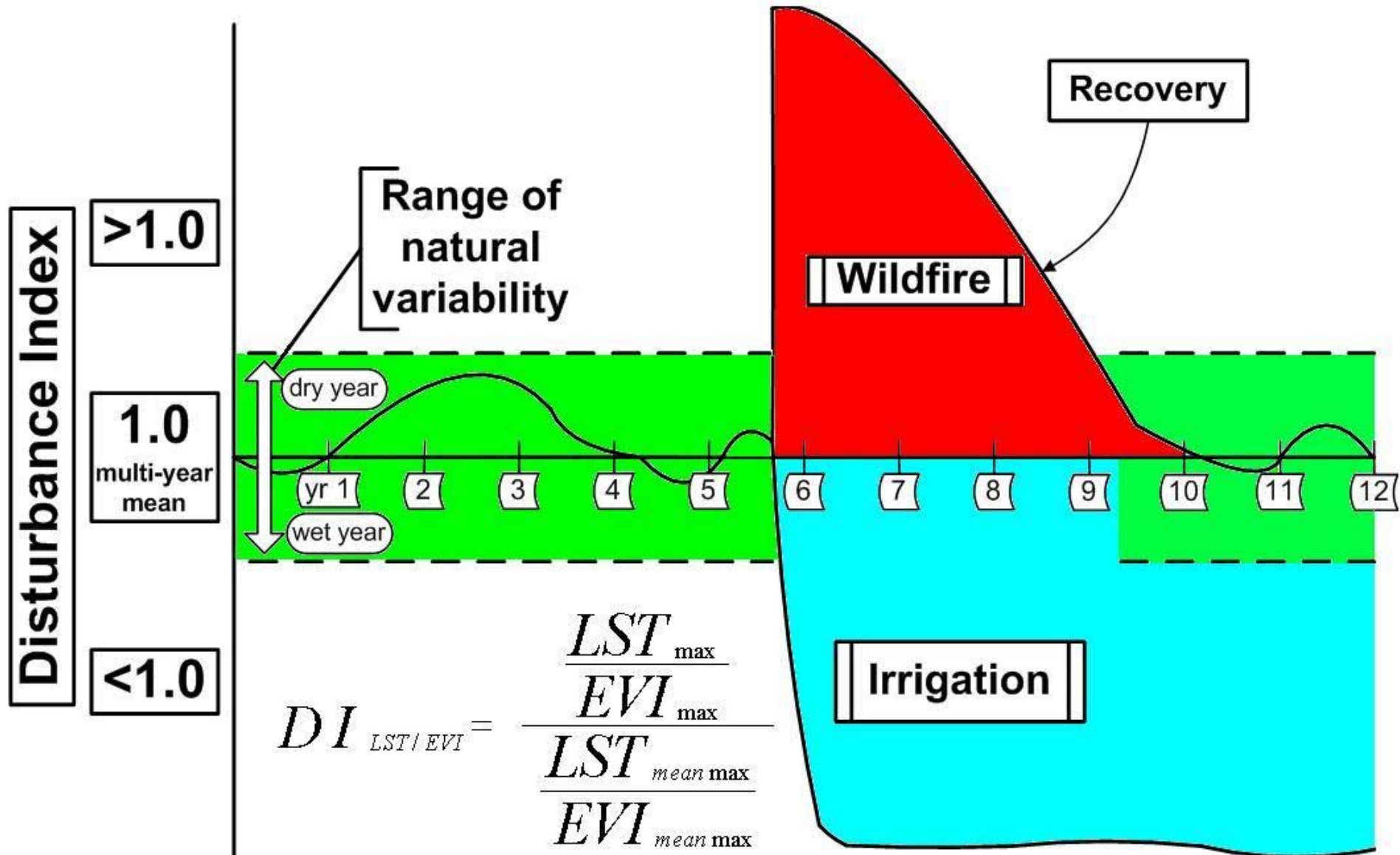


# MODIS Fire Detection YD 211-220, 2006





# GLOBAL Generalized Disturbance Index

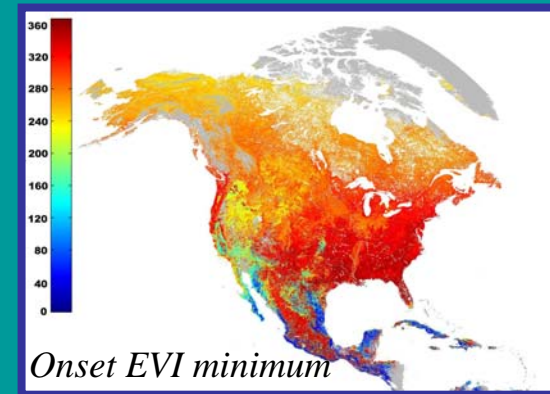
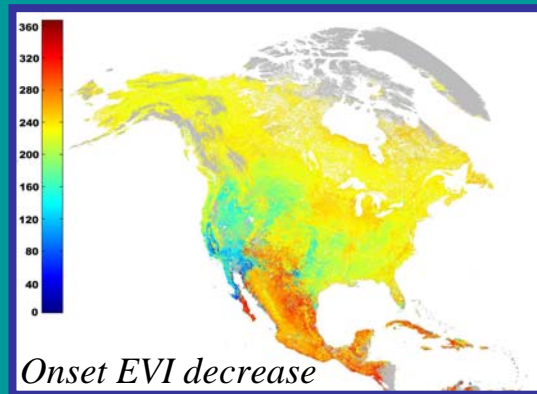
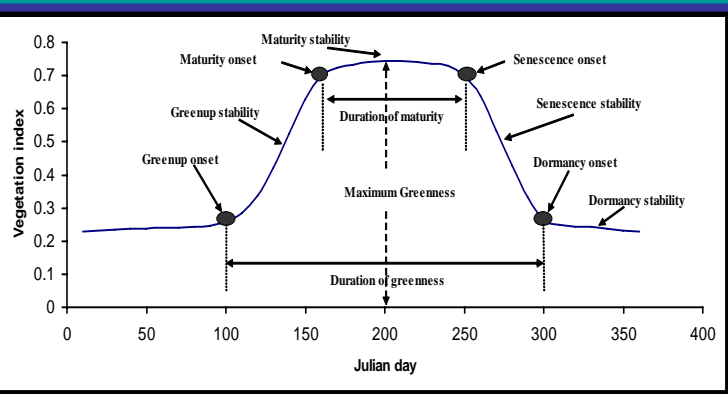
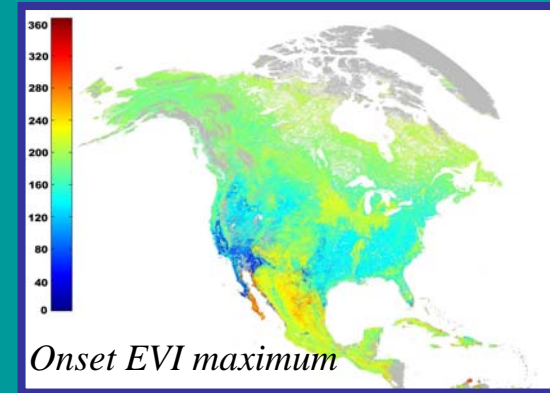
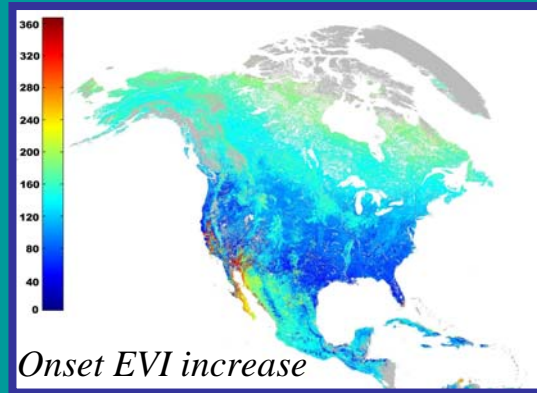


# MOD12Q2: Global Vegetation Phenology

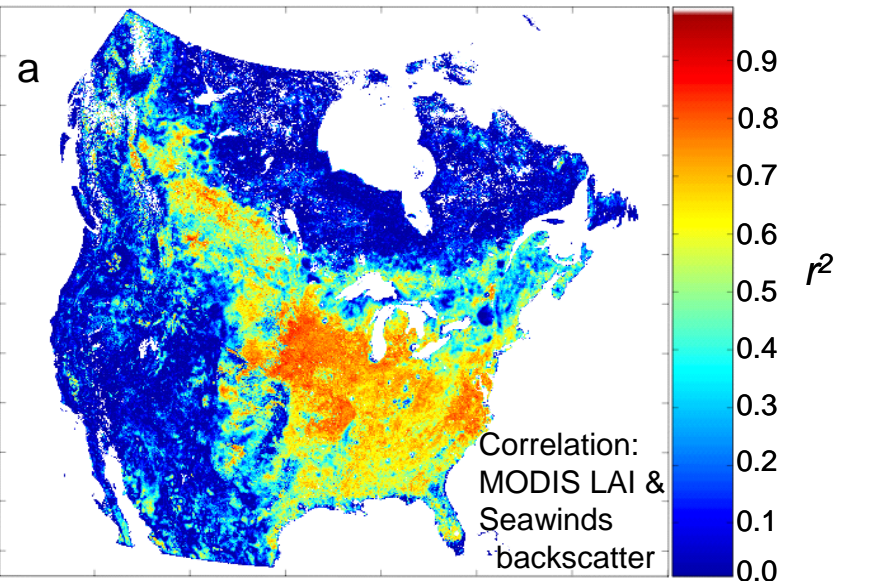
From Mark Friedl, Boston Univ.

First global products for vegetation phenology based on MODIS EVI data released for 2001-2004

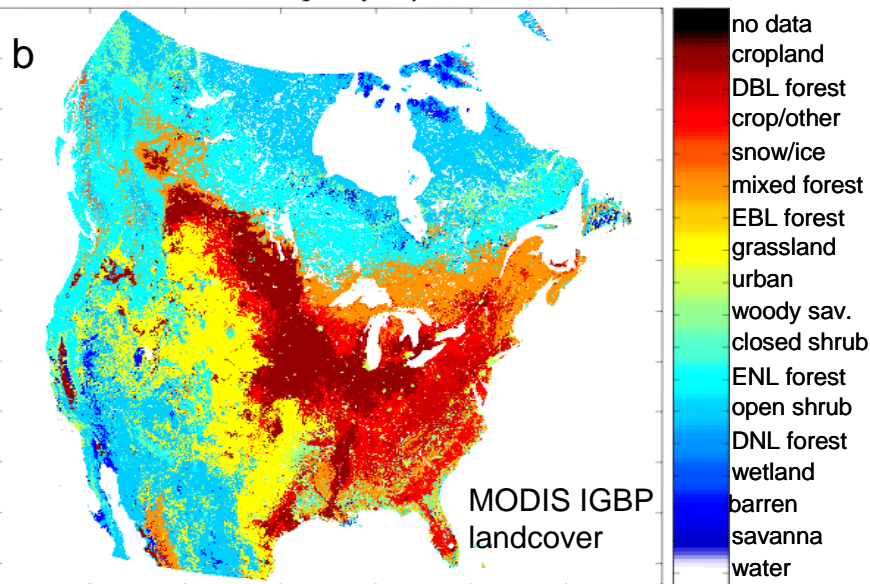
- Identifies key transition dates in growing season



# Developing an Integrated MODIS-SeaWinds Phenology Measure

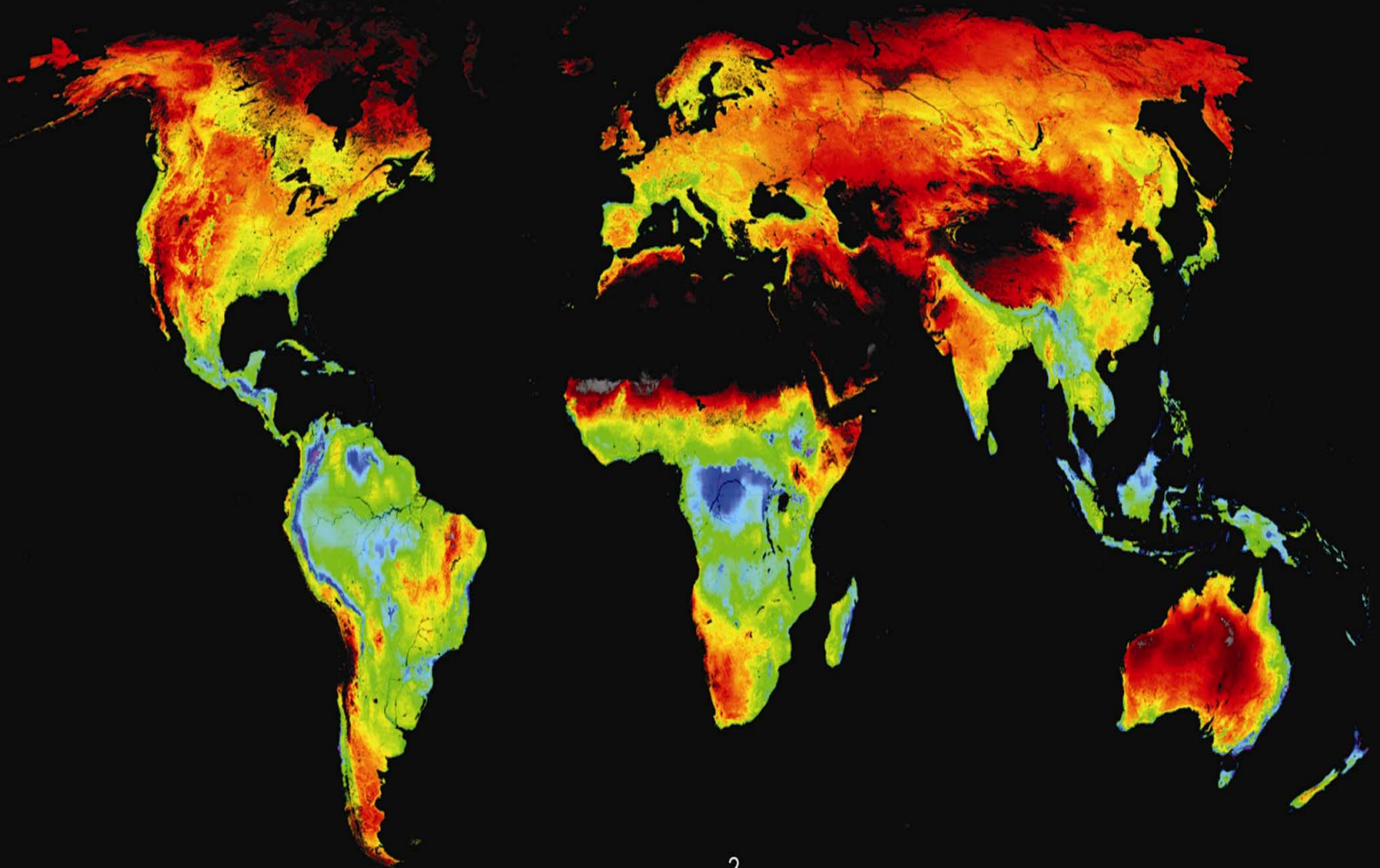


Map (a) of the statistical correspondence ( $r^2$ ) between growing season 8-day composite MODIS LAI (MOD15A2) and SeaWinds Ku band backscatter for January 2000 through August 2002 for North America. Statistical correspondence is lower where LAI seasonal variability is small (e.g., evergreen forests) and where biomass is low (arid and semiarid shrublands). **The combined information from MODIS and SeaWinds may provide an improved measure of vegetation phenology that is less constrained by atmospheric aerosol contamination (e.g., clouds, smoke) and solar illumination effects.**





# MODIS ANNUAL LAND NPP

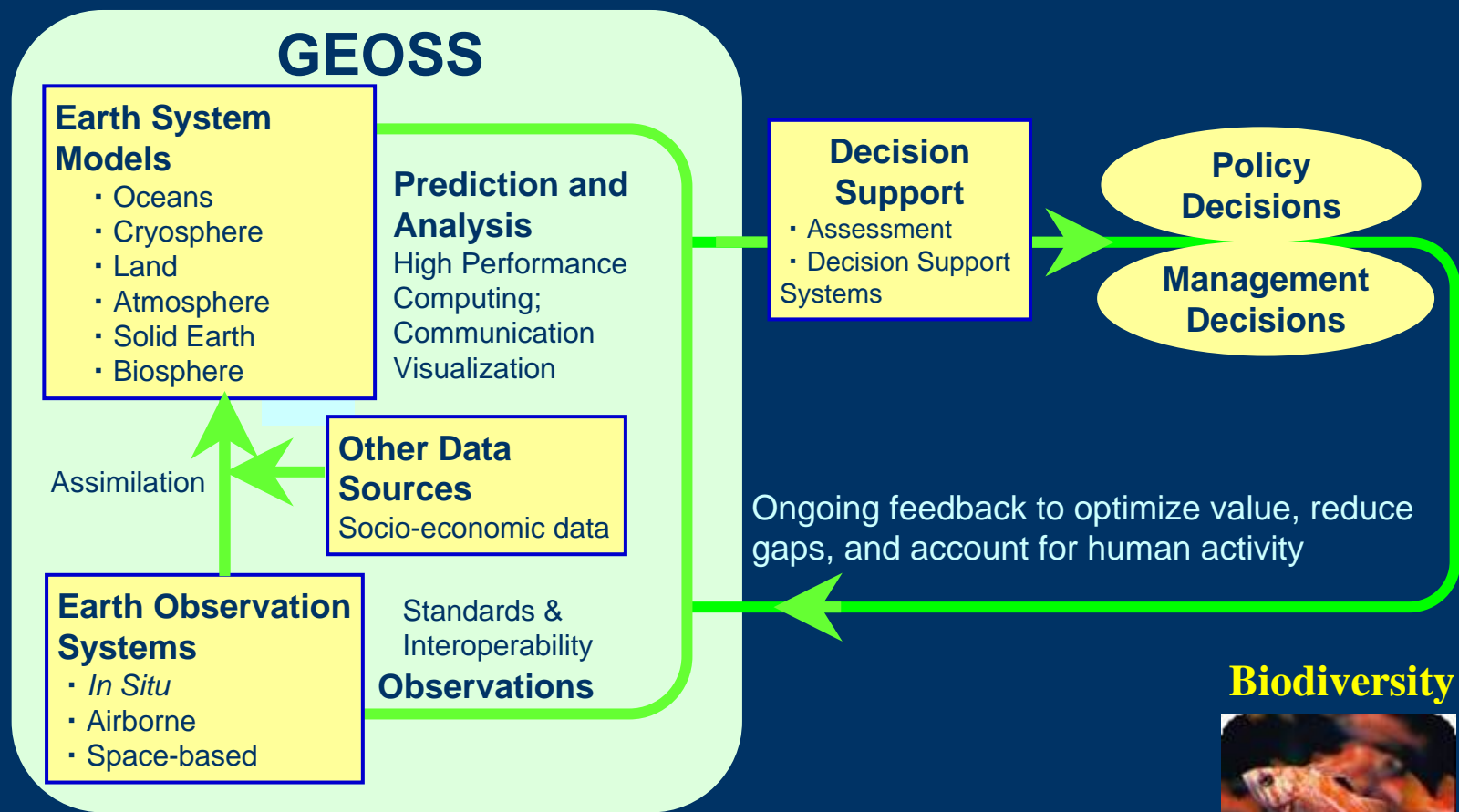


Annual NPP ( $\text{kg C/m}^2/\text{year}$ )

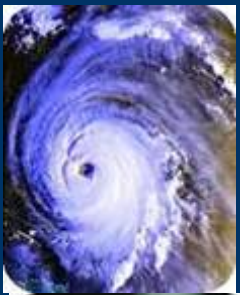


# GEOSS

## (Global Earth Observation System of Systems)



### Disasters



### Biodiversity



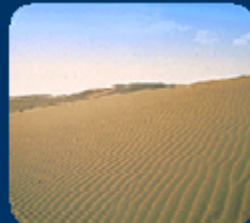
## 9 Societal Benefit Areas



Health



Energy



Climate



Water



Weather



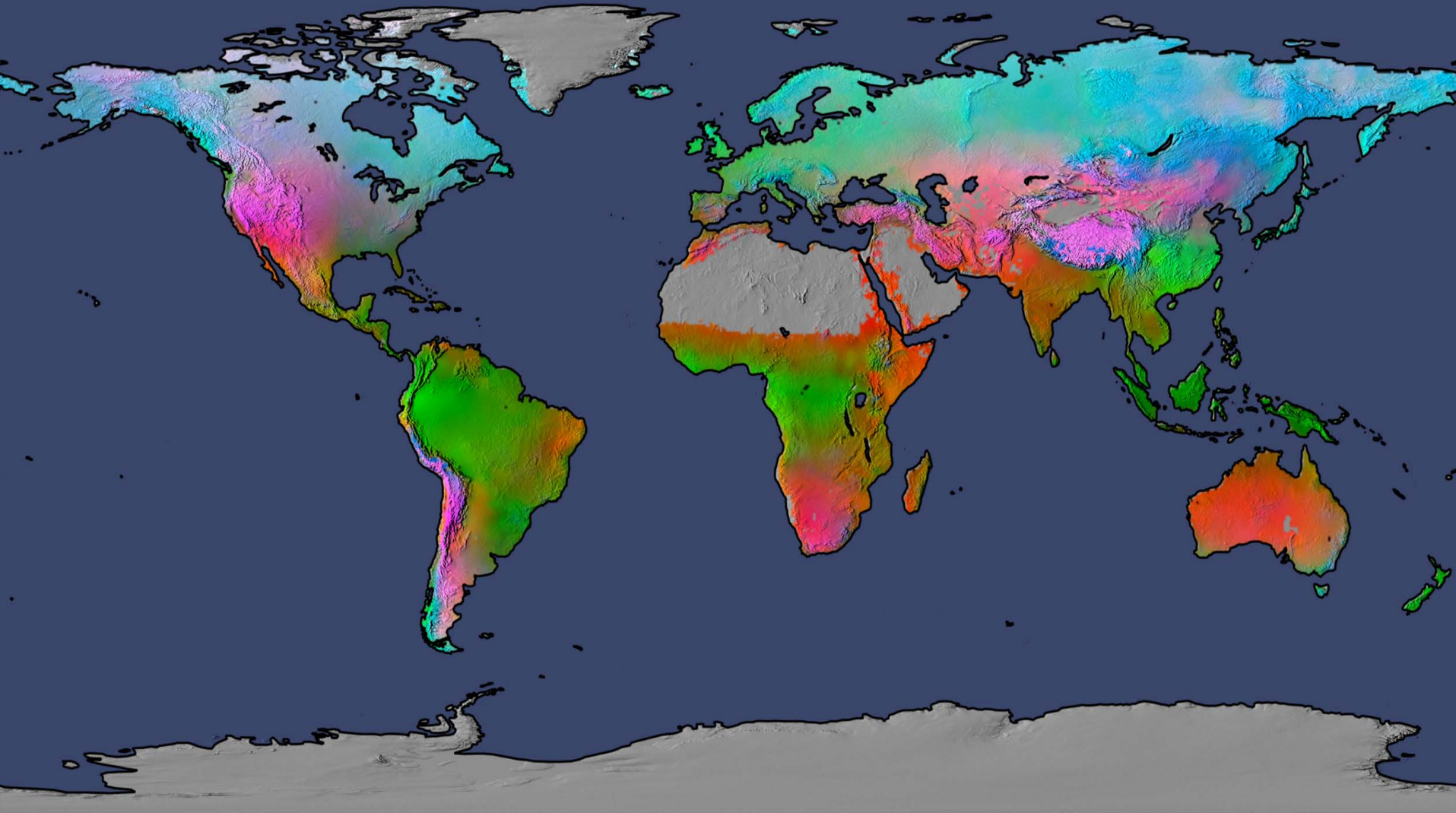
Ecosystems



Agriculture



**Potential climate limits to plant growth derived from long-term monthly statistics of minimum temperature, cloud cover and rainfall.**

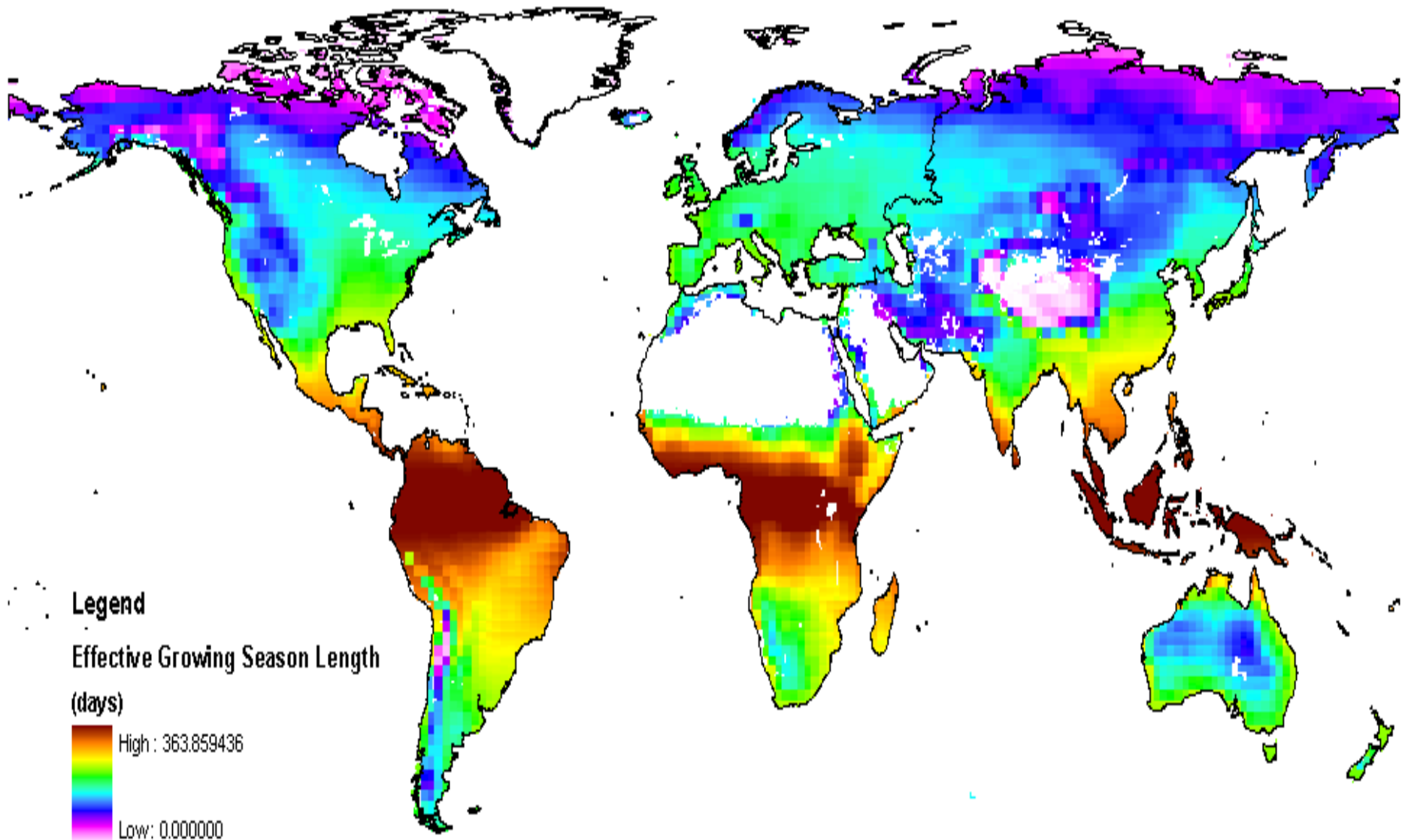


Water = 40%, Temperature = 33%, Radiation = 27%

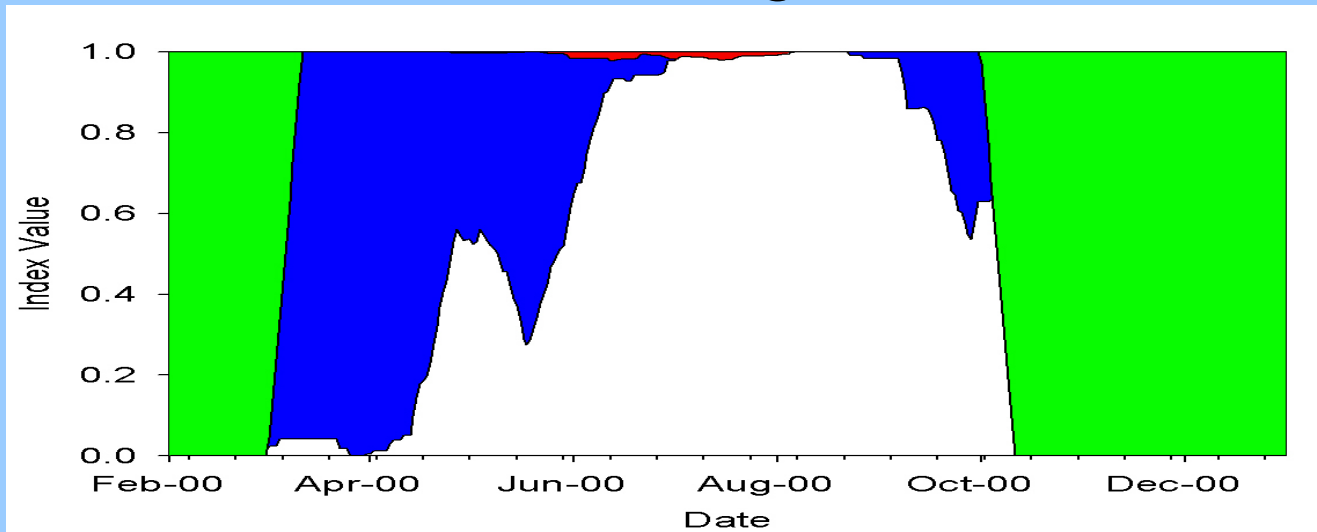
Nemani et al., Science June 6<sup>th</sup> 2003



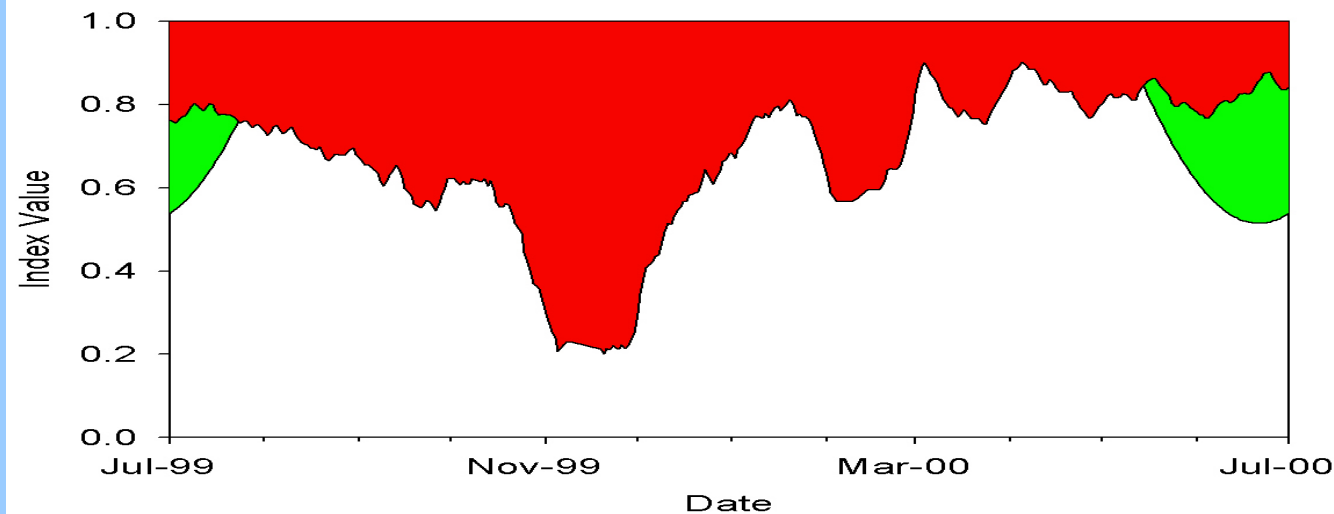
# Global Effective Growing Season Length



# Seasonal Growing Season Constraints



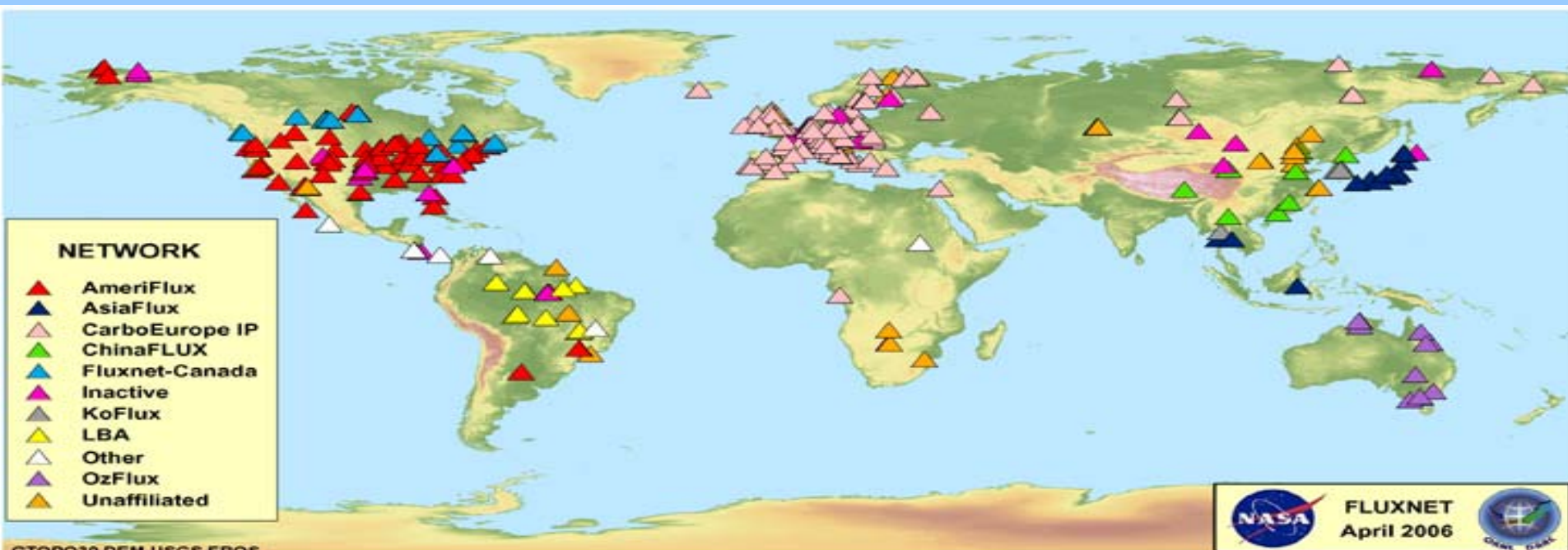
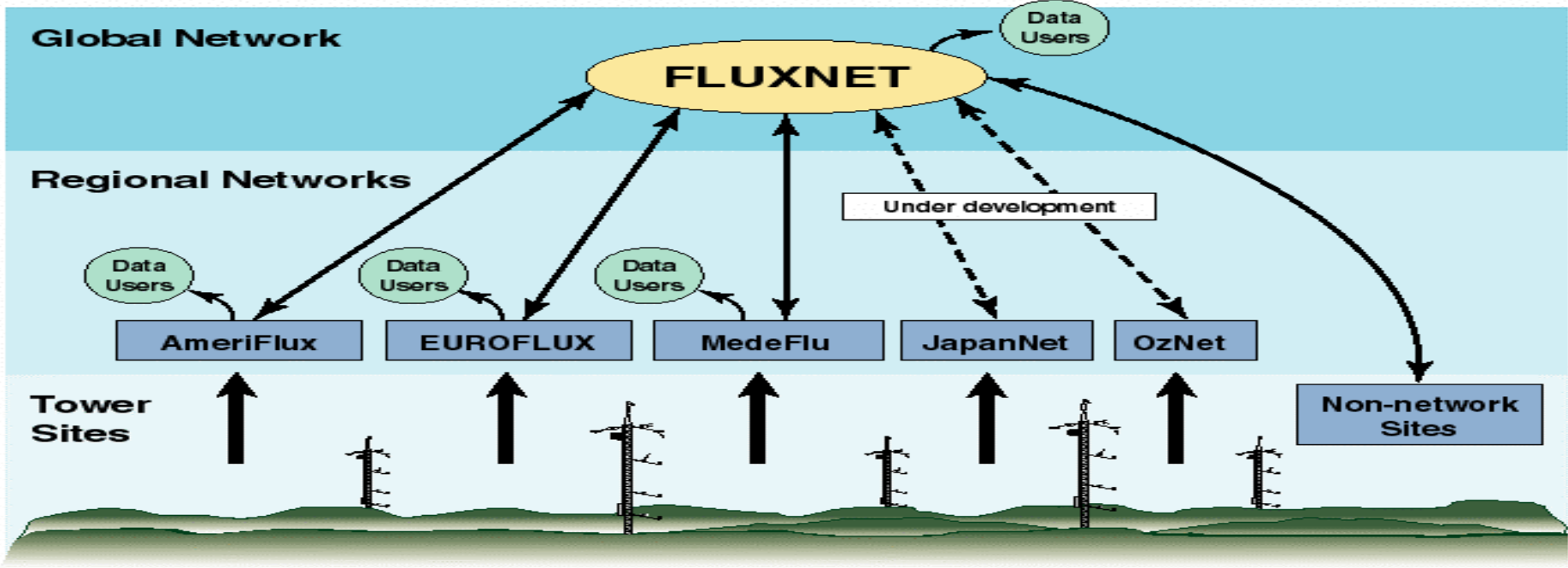
Russia, Boreal



Africa, Savannah

- Vapor Pressure Deficit
- Daylength
- Minimum Temperature

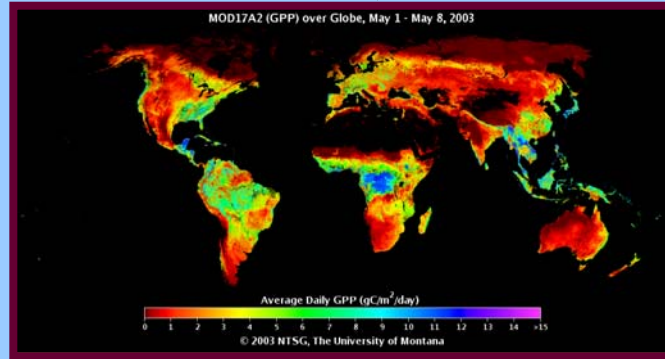
# Architecture of Global/Regional Flux Networks



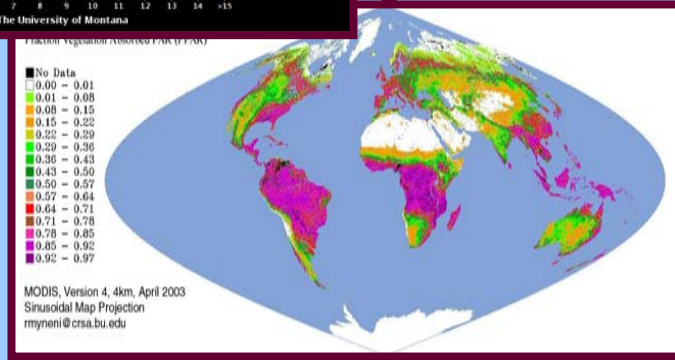


# GPP = Light X Conversion Efficiency

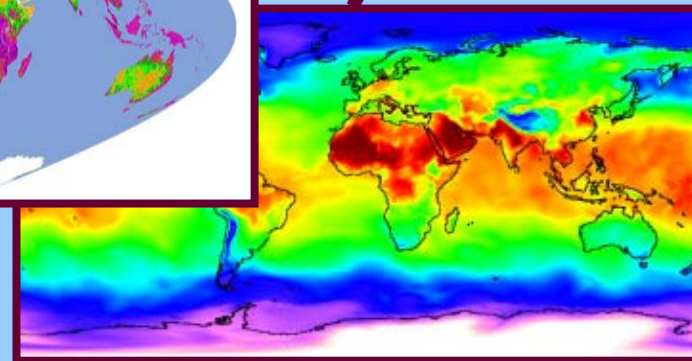
$$\text{GPP} = f(\text{PAR}) \times \epsilon$$



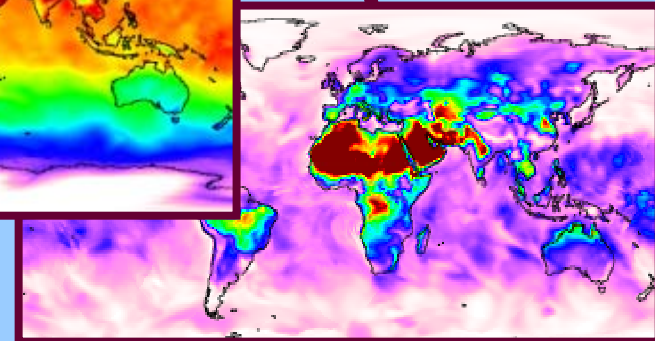
**GPP**



**fPAR, PAR**



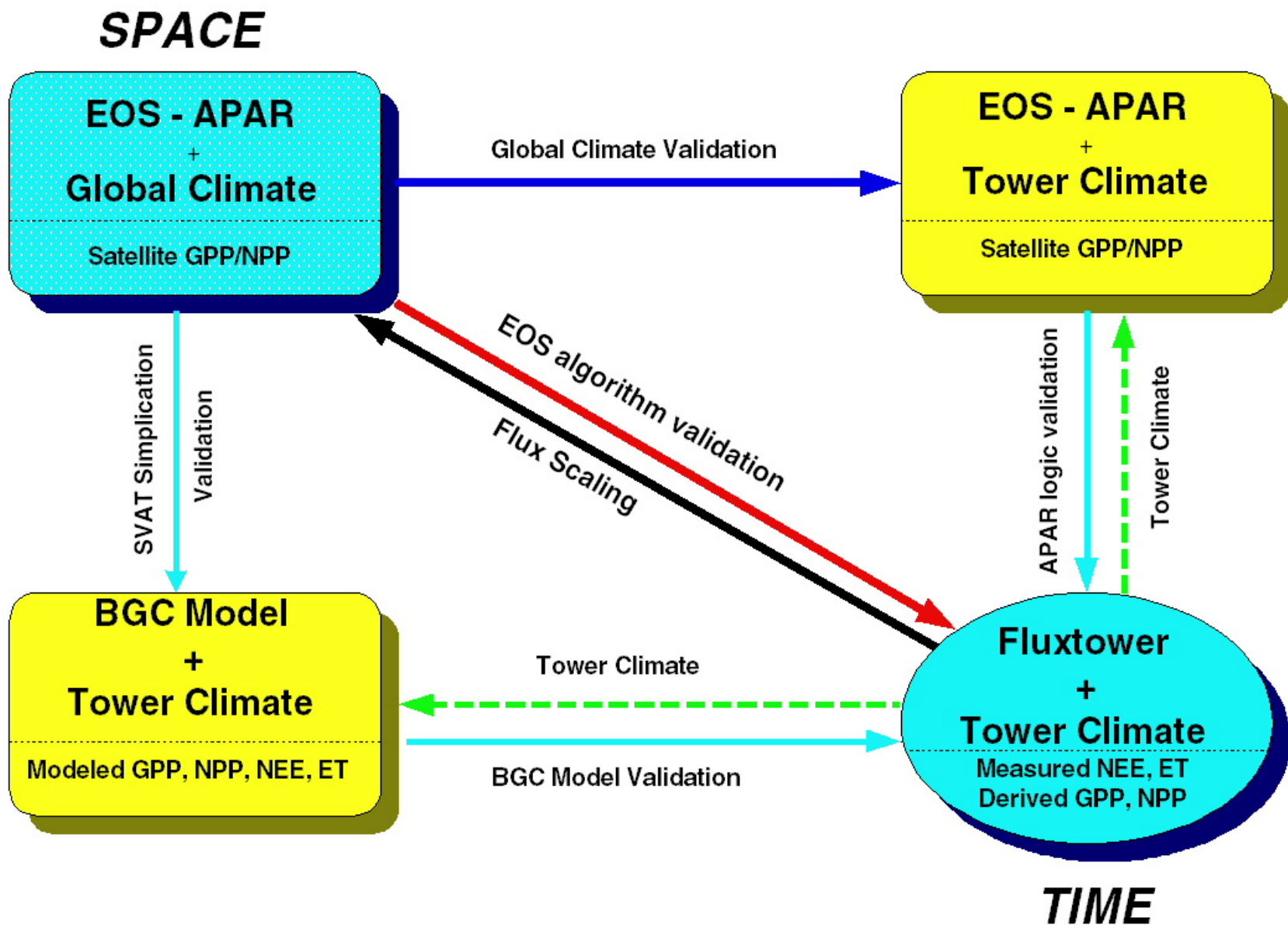
**Temperature**



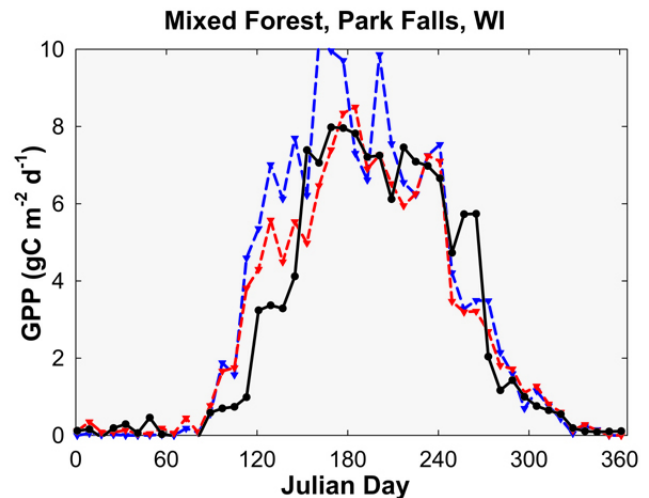
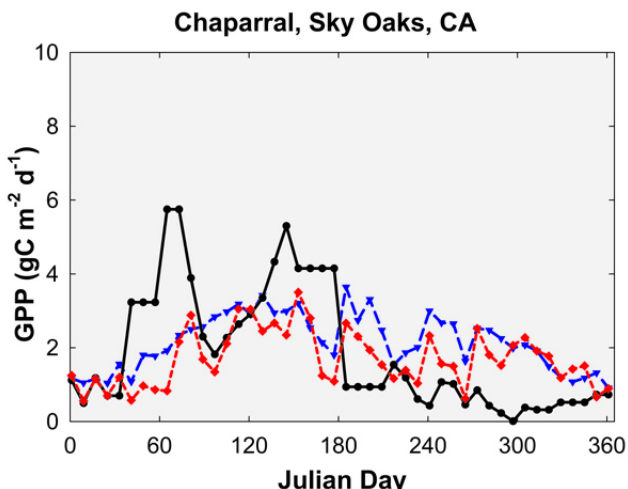
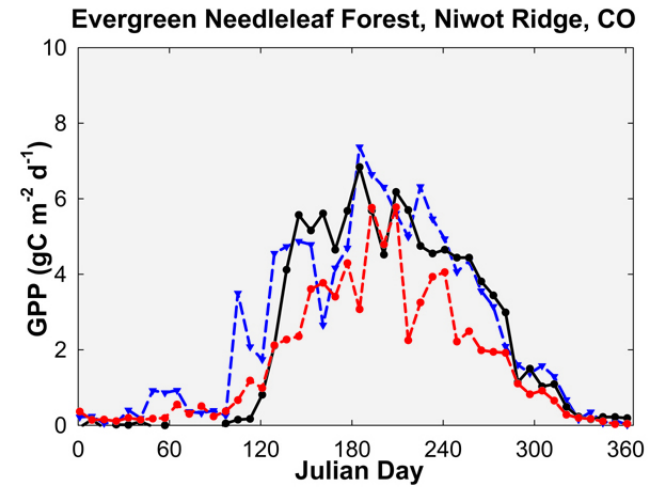
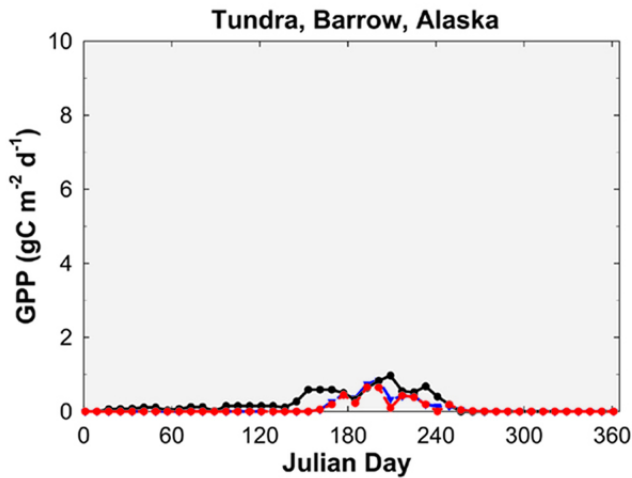
**VPD**

**Biome  
Properties  
Look-Up  
Table ( $\epsilon_{max}$ )**

# FLUX TOWER BASED VALIDATION FOR MODIS GPP/NPP

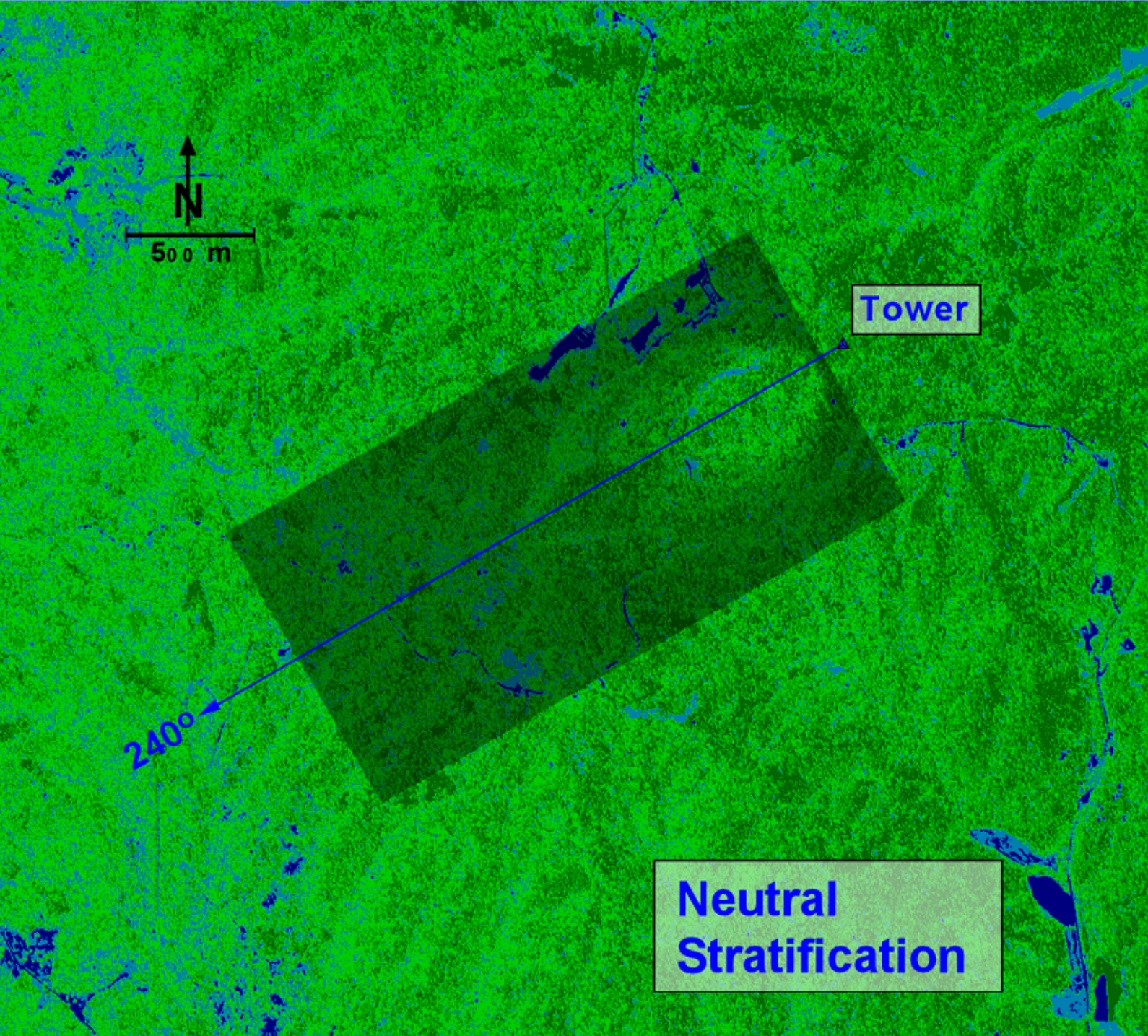


# MODIS GPP Validation with Fluxnet



—▲— MODIS  
—●— Tower  
- -◆- - MODIS w/Tower Met





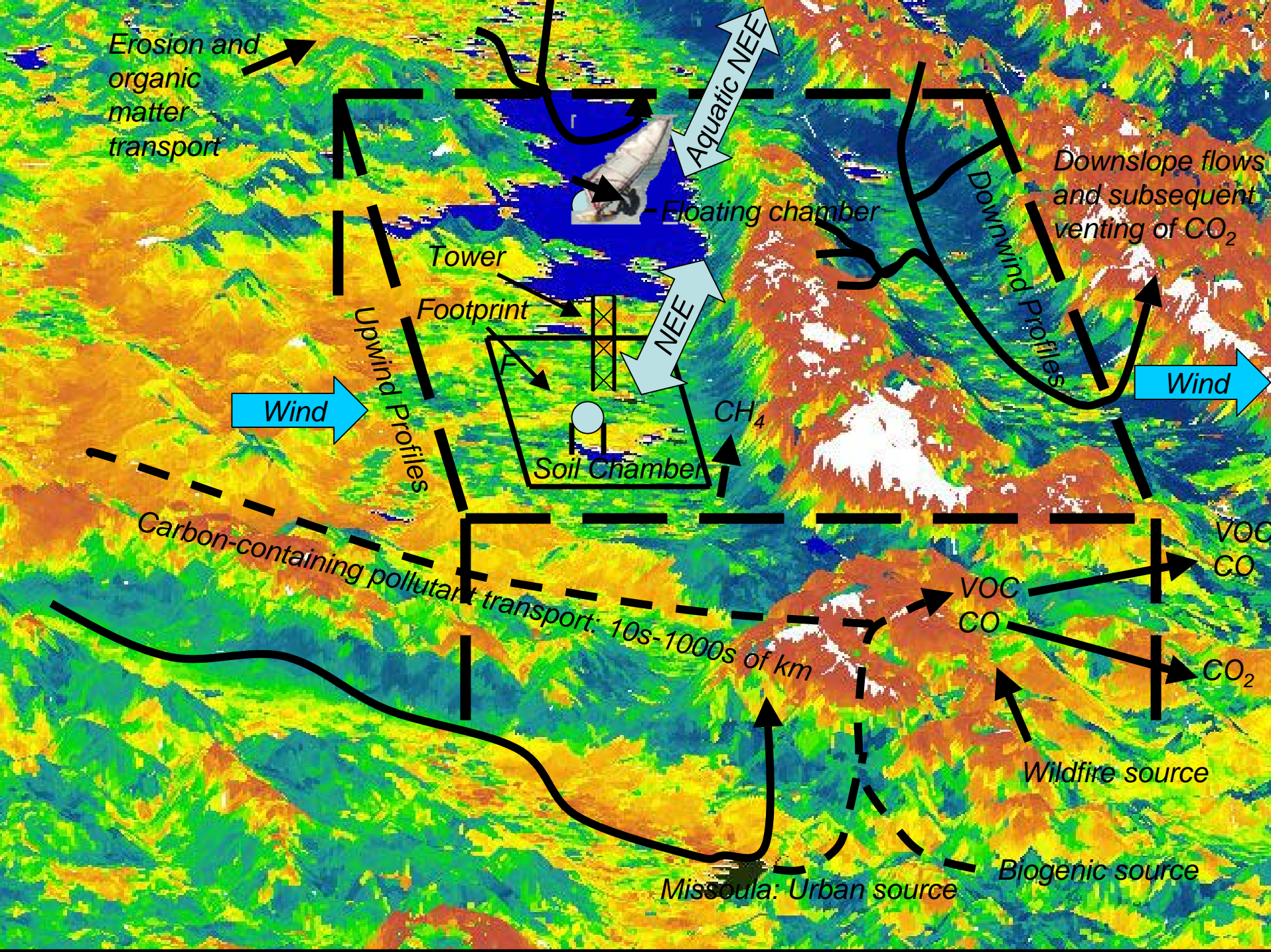
Tower

240°

N  
500 m

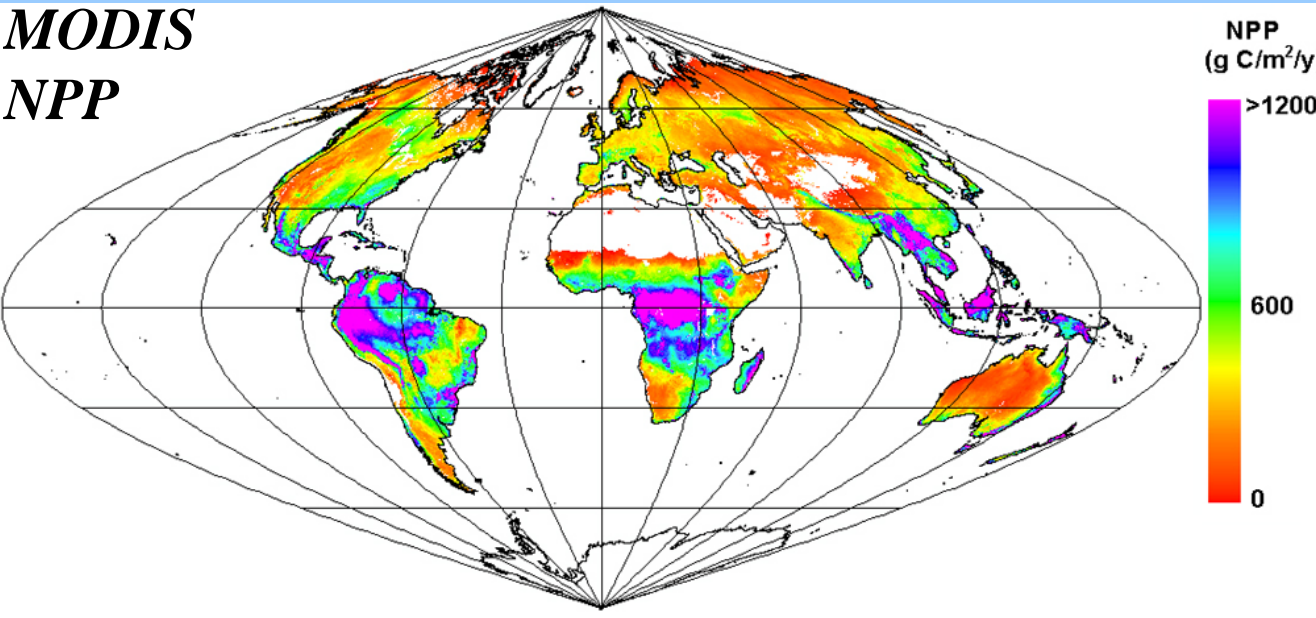
Neutral  
Stratification





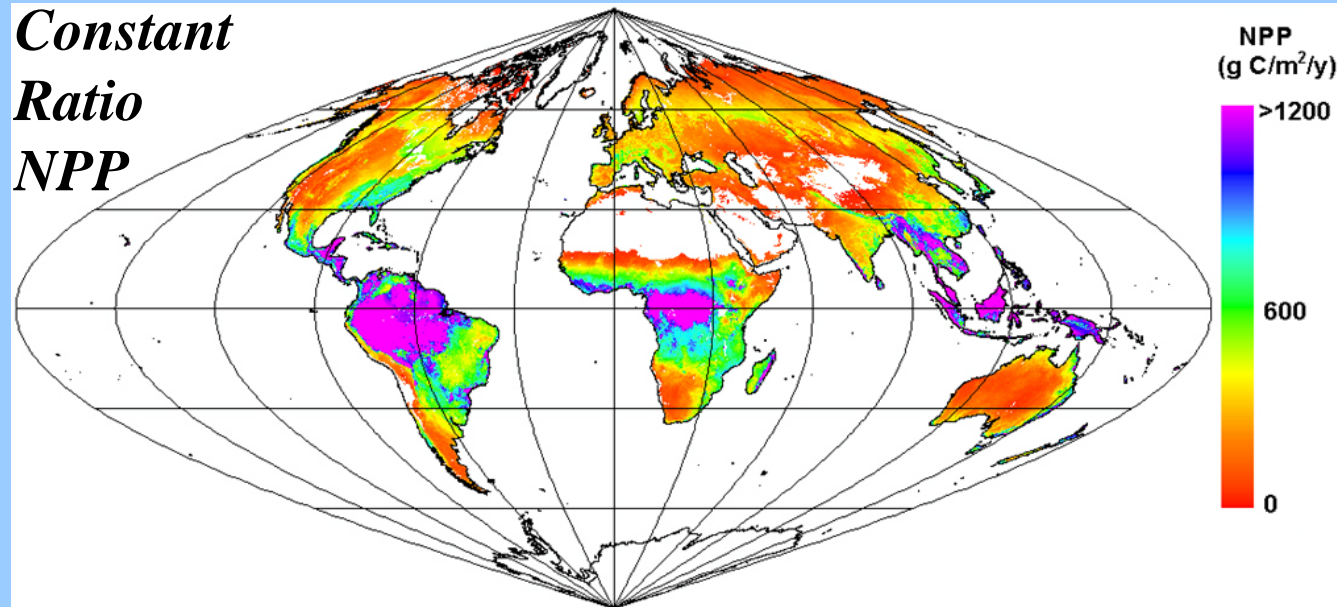
# Uncertainties from Algorithm and BPLUT

**MODIS  
NPP**



- Large algorithm uncertainty is in estimating respiration coefficients

**Constant  
Ratio  
NPP**



- Assume ratio of NPP:GPP = 0.47 across all biomes (*Waring et al., 1998*)

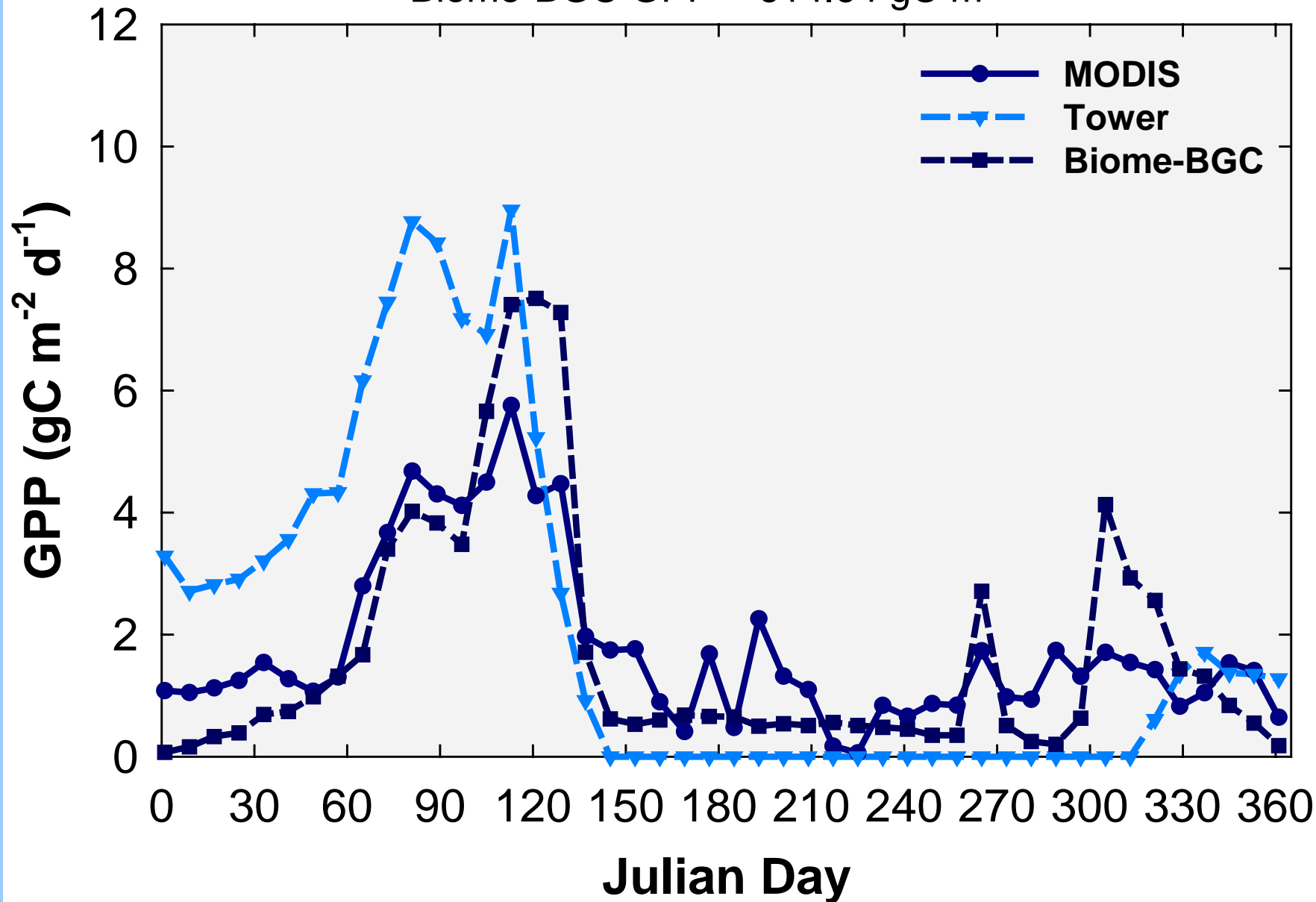


# Grassland, Vaira Ranch, CA, 2001

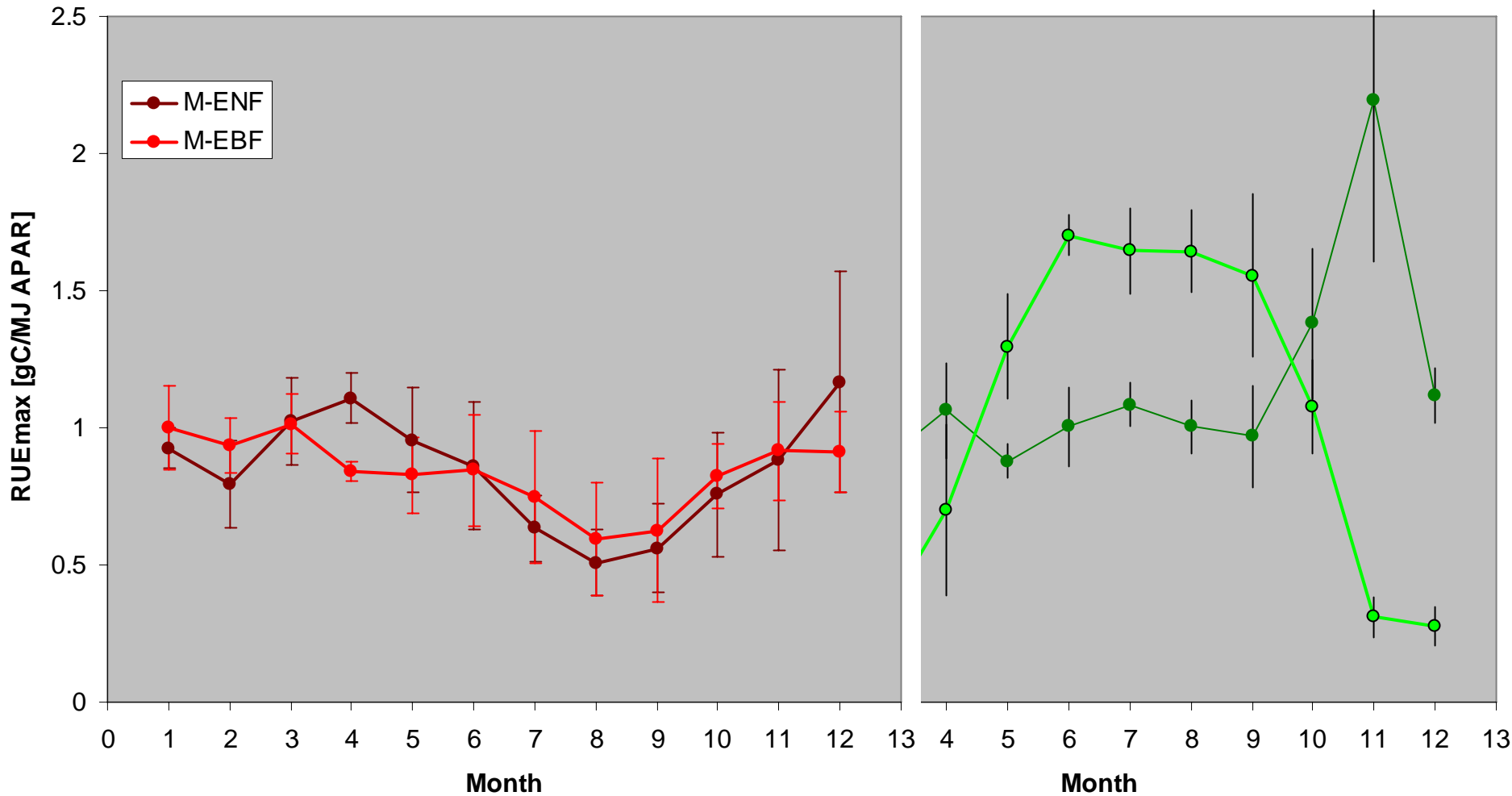
MODIS GPP = 1134.86  $\text{gC m}^{-2}$

Tower GPP = 776.37  $\text{gC m}^{-2}$

Biome-BGC GPP = 614.64  $\text{gC m}^{-2}$



# Seasonal Light Use Efficiency

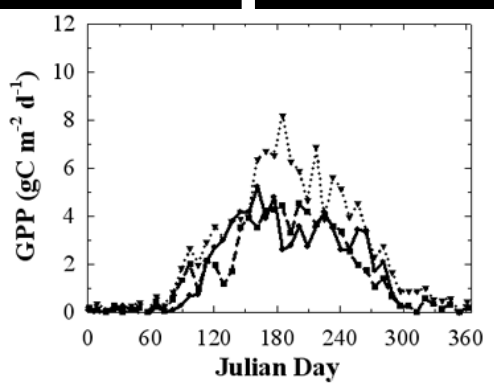
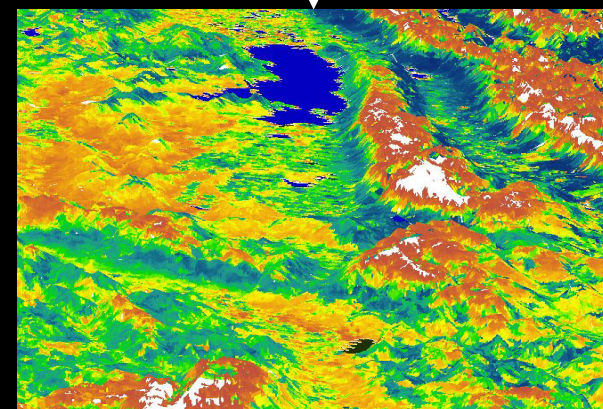
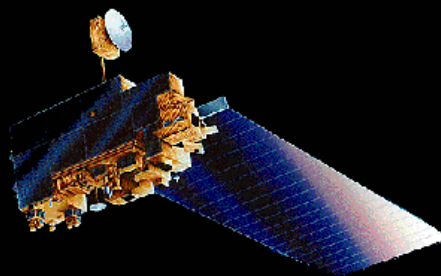


# Dynamic recalibration of satellite GPP algorithm with flux tower data

$$\text{GPP} = f(\text{PAR}) \times \epsilon_{\text{max}}$$

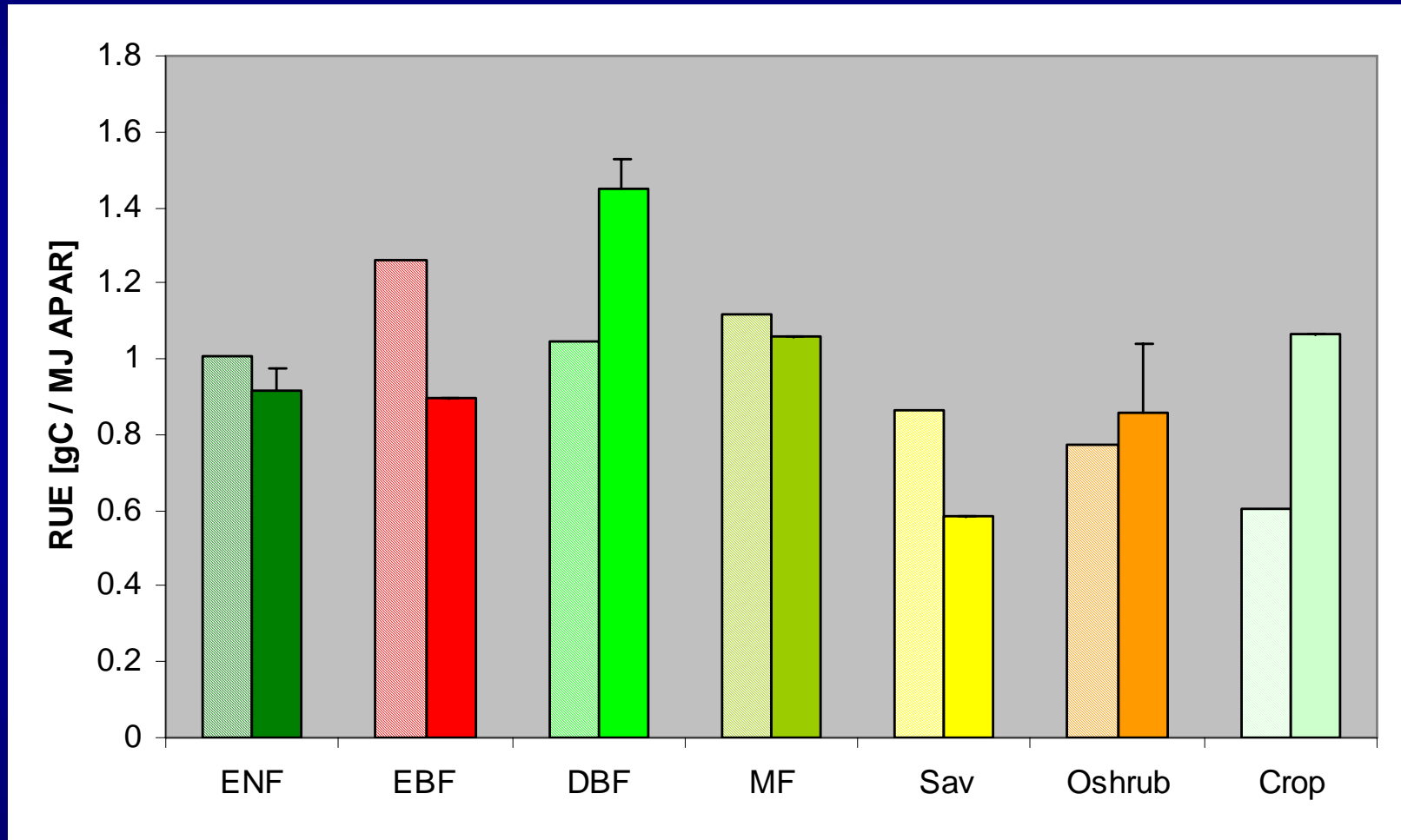
$\epsilon_{\text{max}}$

*recompute monthly*



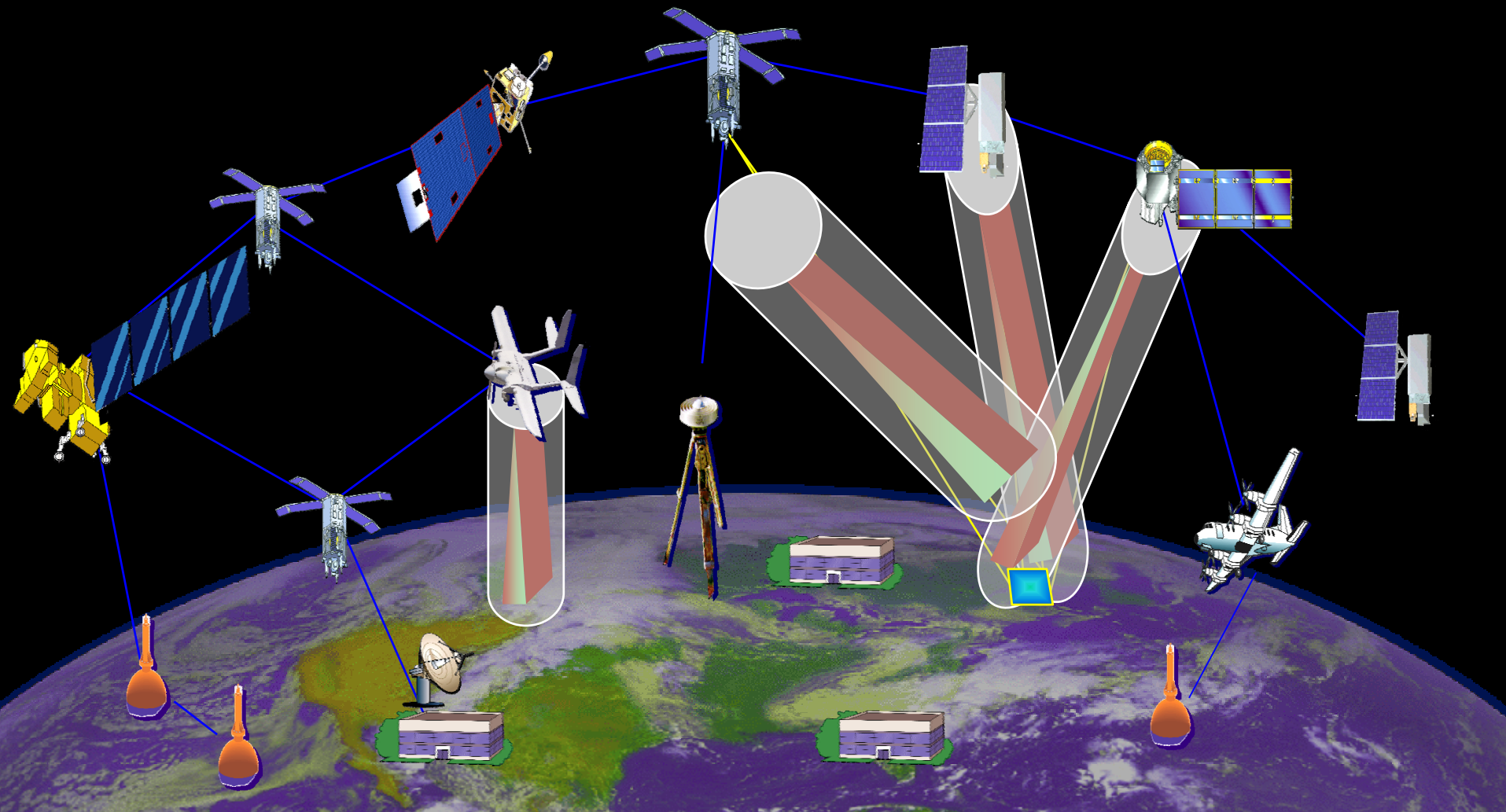


# $LUE_{max}$ estimates by PFT versus $LUE_{max}$ in BPLUT



# Sensor webs

*A sensor web is a coherent set of distributed “nodes”, interconnected by a communications fabric, that collectively behave as a single, dynamically adaptive, observing system.*

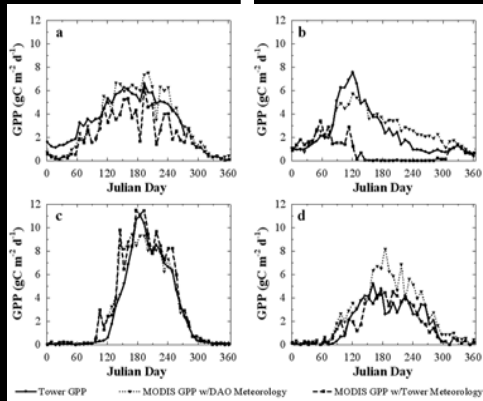
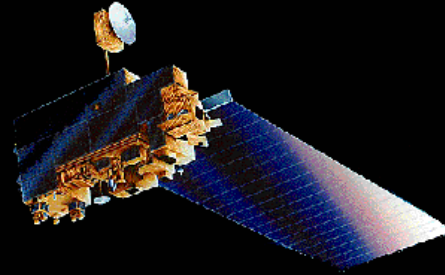


# GEOSS - Integrated Biospheric Monitoring concept for Global GPP

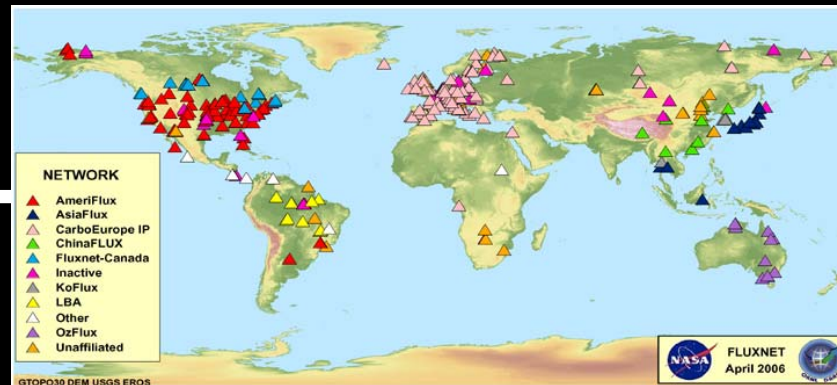
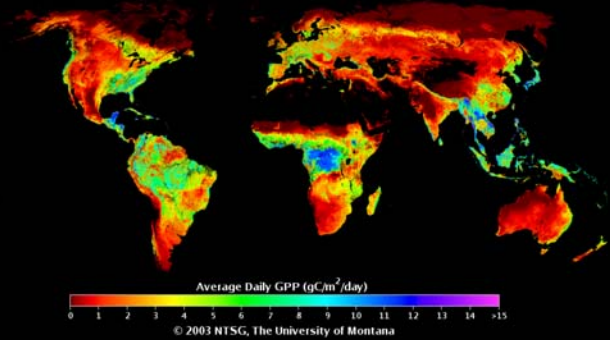
$$\text{GPP} = f(\text{PAR}) \times \epsilon_{\text{max}}$$

$\epsilon_{\text{max}}$

recompute monthly



MOD17A2 (GPP) over Globe, May 1 - May 8, 2003





Budget, technical, and administrative problems continue to plague a fleet of U.S. polar satellites being built for the military, weather forecasters, and climate researchers

## Stormy Skies for Polar Satellite Program

WITH MORE USES THAN A SWISS ARMY knife, the National Polar-Orbiting Operational Environmental Satellite System (NPOESS) was supposed to be the world's most sophisticated series of weather satellites. But somewhere in its 12-year history, the multibillion-dollar NPOESS has also become one of the country's most troubled technology projects. Next week, the Pentagon will issue binding plans on how to fix a project now behind schedule and massively over budget. The expected overhaul could shape for decades how well U.S. forces prepare for battle, civilian authorities anticipate killer storms, and scientists understand Earth's ever-changing climate.

Since the 1960s, the U.S. Department of Defense and the National Oceanic and Atmospheric Administration (NOAA) have used separate north-south orbiting satellite systems to provide daily global weather coverage and crucial multiday forecast data. In 1994, President Bill Clinton proposed to merge those systems in a \$6.5 billion project that was to save an estimated \$1.8 billion over its lifetime. The system would pack 14 sensors—half of them new—onto six 7-meter-long crafts, with three flying at a time until 2018. Sounders would probe the air column, sensors would look through clouds as well as watch for space weather, and the crafts' capabilities would be a quantum leap over decades-old NOAA and Pentagon polar systems. "We have made major strides to converge military and civil weather requirements," Air Force Maj. Gen. Robert Dickman told Congress in 1995.

But now, more than a decade later, technical problems on one of the sensors have rippled through the program and pushed estimated cost overruns into the billions of dollars. As currently configured, the system is as much as 3 years behind schedule and carries, by the Pentagon's latest estimate, a lifetime price tag

of \$14 billion (see graph). The overrun triggered an automatic top-to-bottom review, which the Secretary of Defense is set to present to lawmakers next week.

The delay could leave U.S. forces without the best data on sandstorms or ocean currents, military planners worry, not to mention a possible weakening of civilian weather coverage if there are problems with a NOAA satellite scheduled to be launched in 2007. What the Government Accountability Office (GAO) calls a "program in crisis" is really the "flooding of America," according to Representative Bart Gordon (D-TN), ranking Democrat on the House Science Committee, who wants NOAA Administrator Conrad Lautenbacher to resign for ignoring what Gordon says were clear warn-

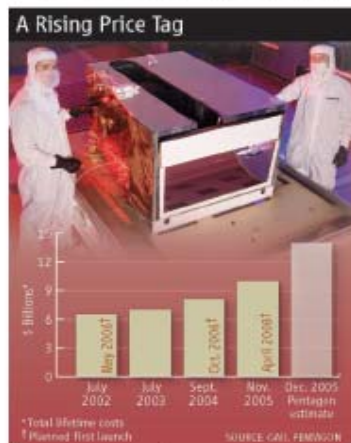
ing signs about NPOESS. "This is a program that is dangling by a thread," says one congressional staffer who follows the project.

### NPOESSing a challenge

Polar satellites are wonderfully useful because their 100-minute orbits provide coverage of nearly every point on Earth. But their attractiveness didn't forge an automatic alliance between defense and research bureaucrats operating in two different cultures. "NOAA looked at the Air Force and said, 'Huh, goose-stepping fascists.' And the Air Force looked at NOAA and said, 'Fish-kissing tree huggers,'" said former program manager John Cunningham at a 2003 briefing on the project.

Their needs were different as well: The Pentagon wanted sensors with high resolution and speedy delivery of the data, whereas NOAA sought instruments with a multitude of spectral bands for weather research. NASA agreed to join in, canceling planned follow-ons for environmental missions while adding environmental and climate sensors to the NPOESS fleet after its scientists lusted after the chance to use systems whose sequential platforms will stay aloft for 20 years rather than the usual 5-year window. "I thought [NPOESS] was the right thing to do, and in some ways, the only way to do it," says biogeochemical modeler Berrien Moore of the University of New Hampshire, Durham, who has long advised the government on behalf of the climate community.

The initial cooperation went "surprisingly well," says the Navy's Robert Winokur, then head of NOAA's satellite program. The package would include everything from an ozone detector to a device for aerosol studies (see graphic, p. 1297). The microwave imager would provide more channels for detailed moisture profiles than existing instruments. And the Visible/Infrared Imager Radiometer



Skyward. The Pentagon's estimate for the program is much higher than what NPOESS staff assume.

**THE END**

