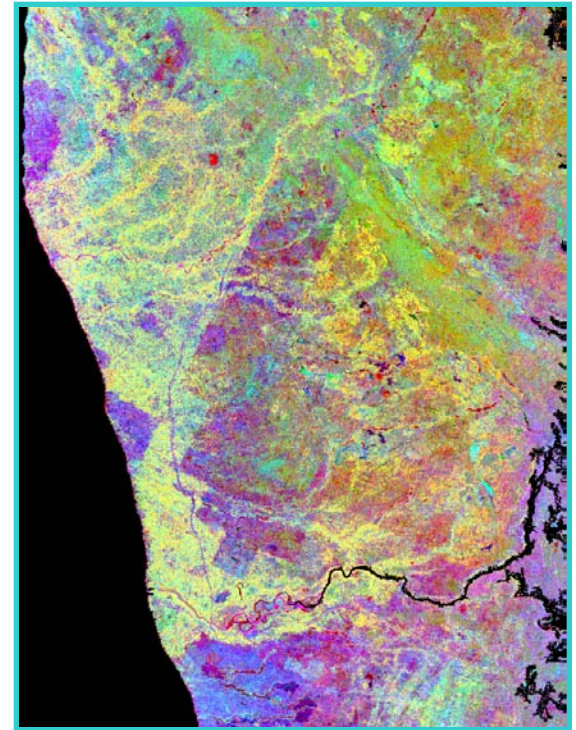
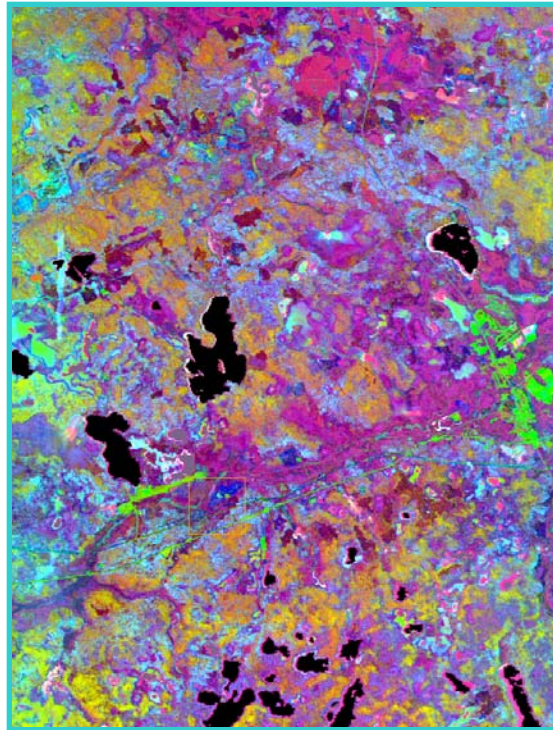
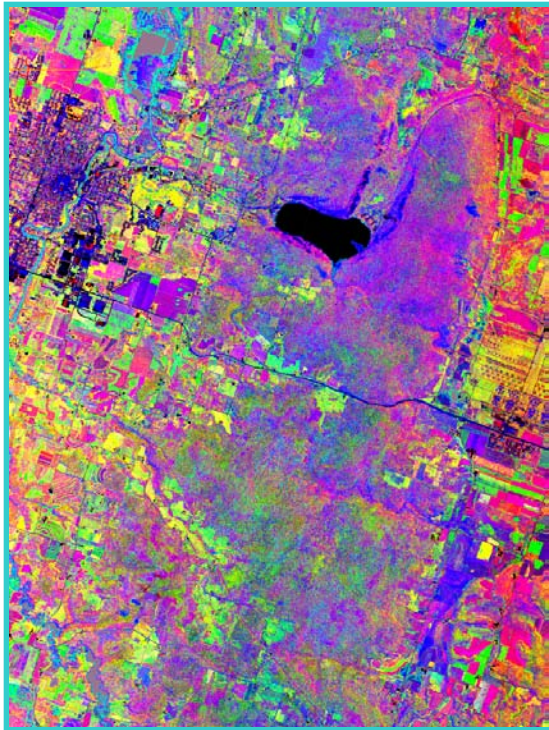


# HyspIRI: Imaging Spectroscopy of Plant Metabolic and Ecological Function

Phil Townsend, Shawn Serbin, Aditya Singh, Dylan Dillaway,  
Brenden McNeil and Eric Kruger

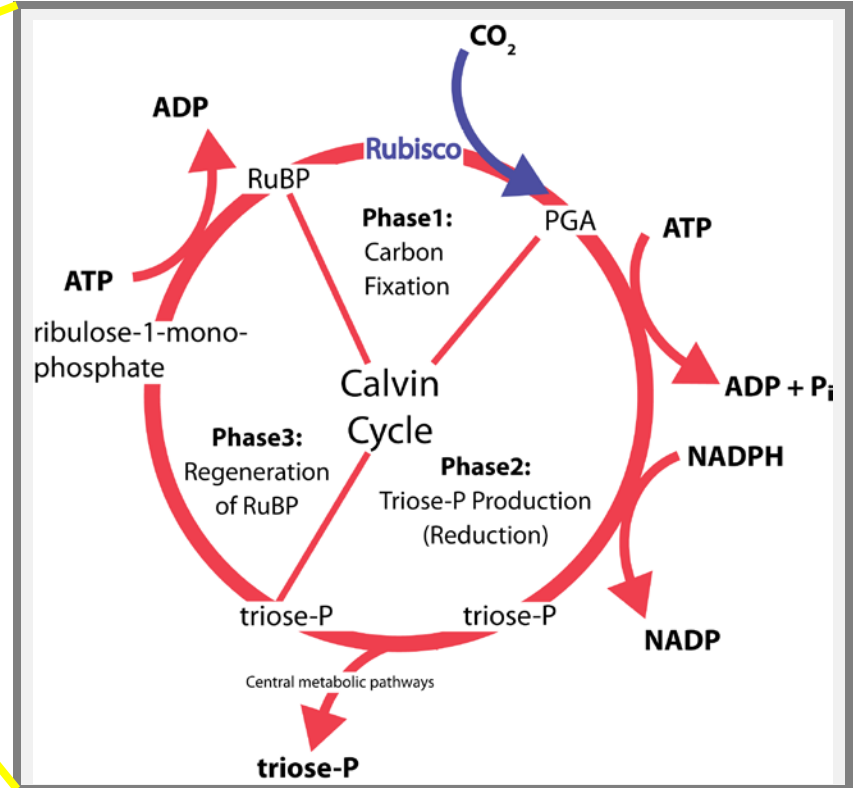
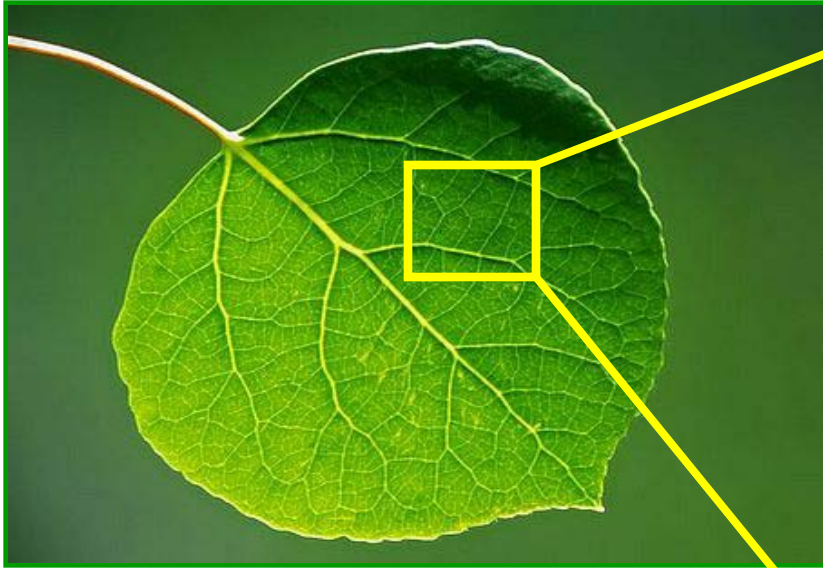


**FERST**

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

# Photosynthesis:

A temperature-mediated photochemical reaction



Climate is key to photosynthetic potential.

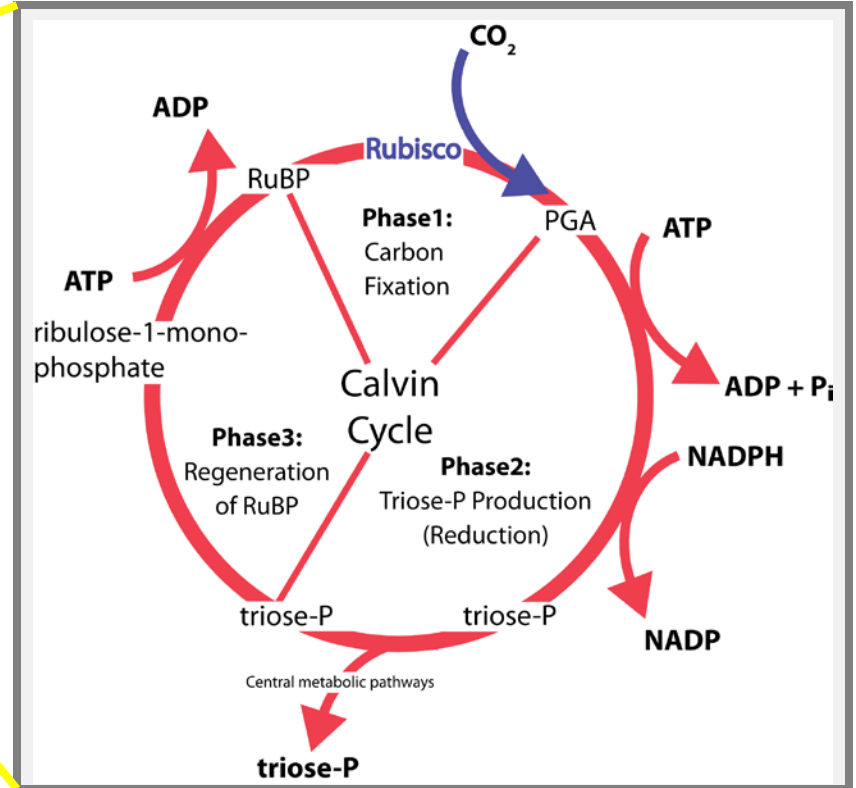
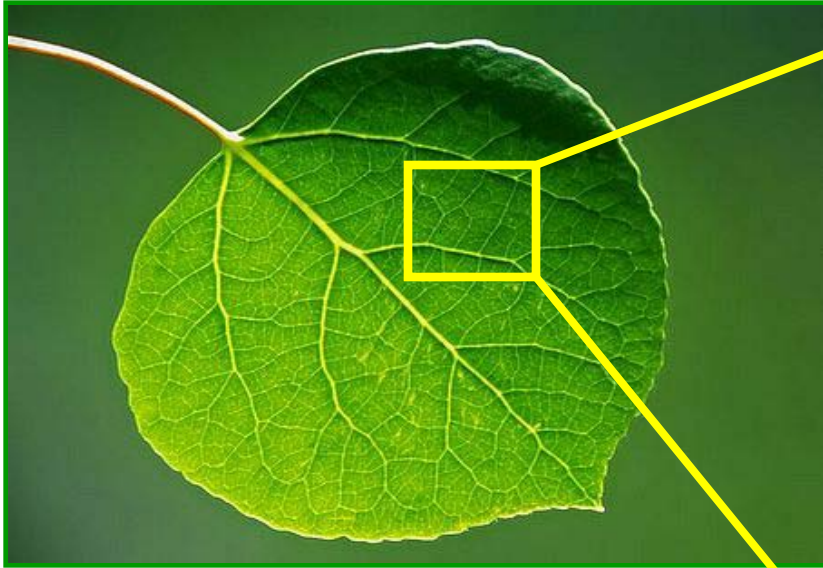
## FERST

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON



# Nutrient dynamics:

## Plant allocation and use of resources



Cell structure (water use),  
shade tolerance (N use),  
recalcitrance (decomposition)

# FERST

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

## Key concepts for climate change research:

Photosynthesis is driven by light, temperature, water availability, nutrients, etc.

If we can measure specific processes of photosynthesis using imaging spectroscopy and thermal (temperature) measurements, then:

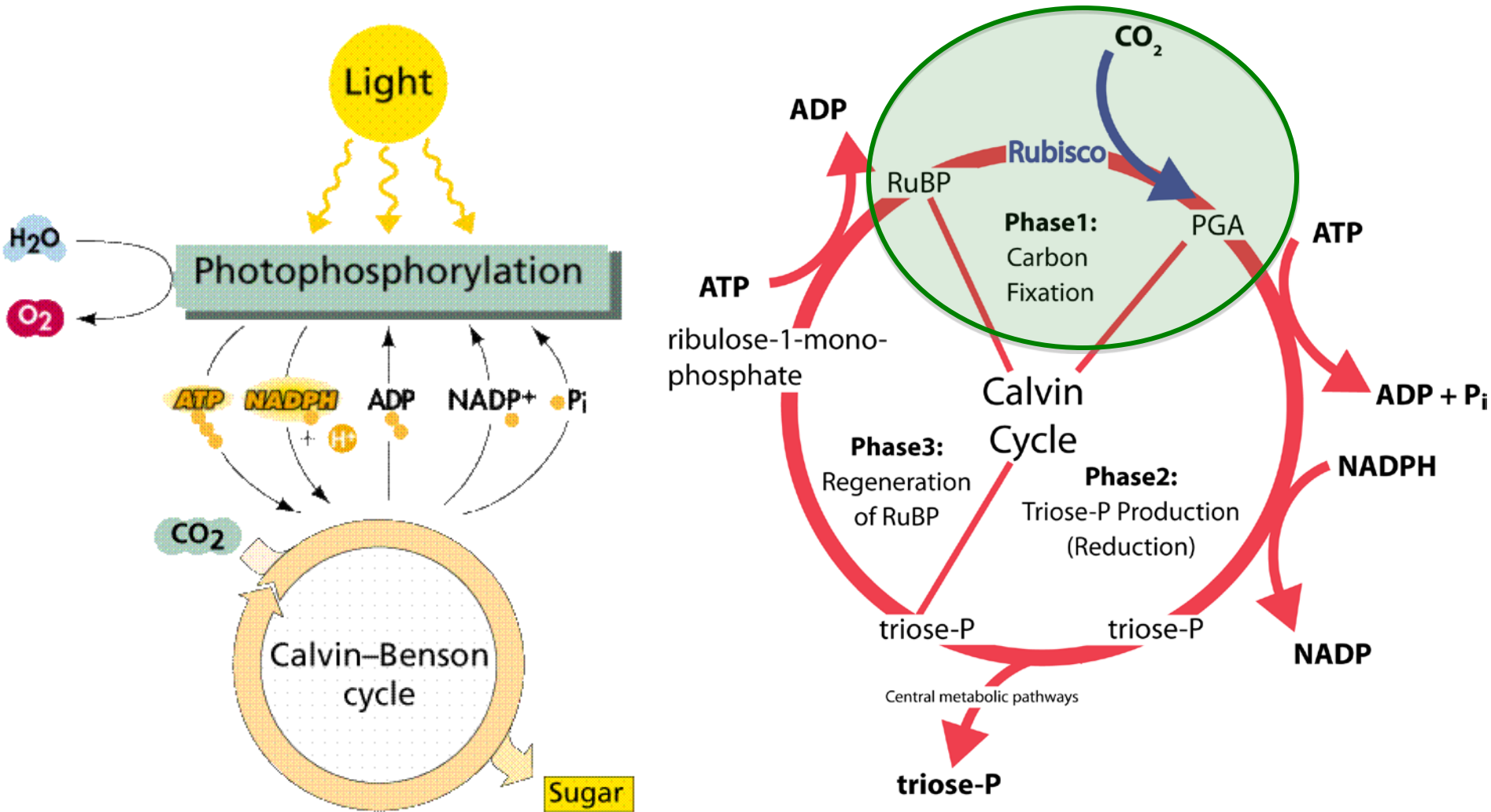
- We can measure changes in photosynthetic rates, and:
- Assess changes in carbon assimilation by vegetation and changes in vegetation function associated with  $\Delta T$ .
- *Global mission necessary to evaluate changes in photosynthesis that occur over large areas.*



**FERST**

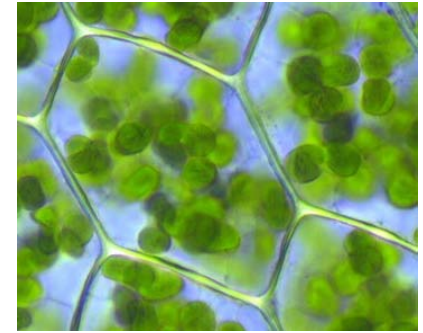
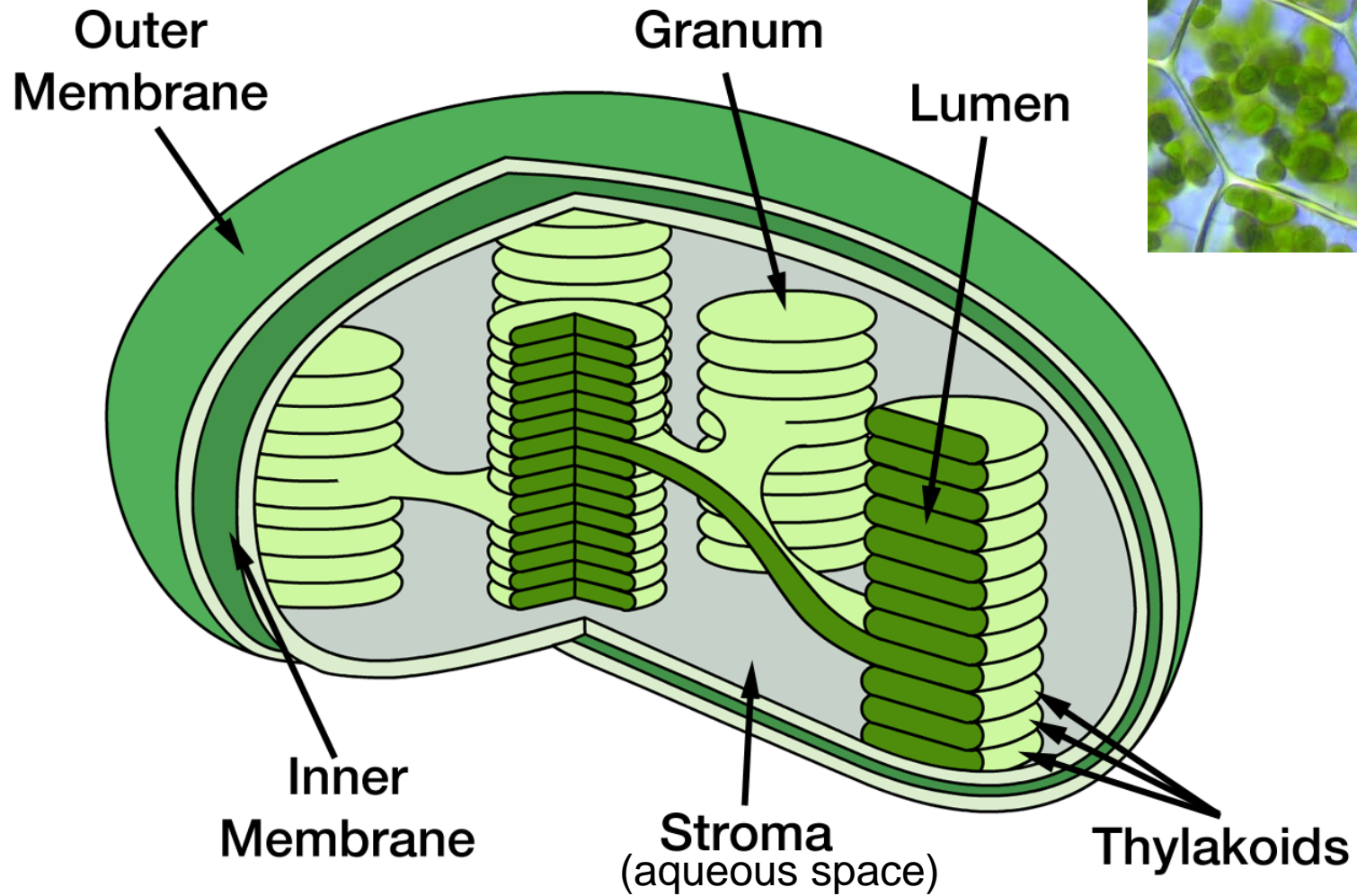
FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

# Definition: $V(c)_{max}$ – maximum rate of carboxylation



Carboxylation – initial addition of  $CO_2$  to RuBP (catalyzed by RuBisCO). Addition of ATP and NADPH  $\rightarrow$  triose phosphate

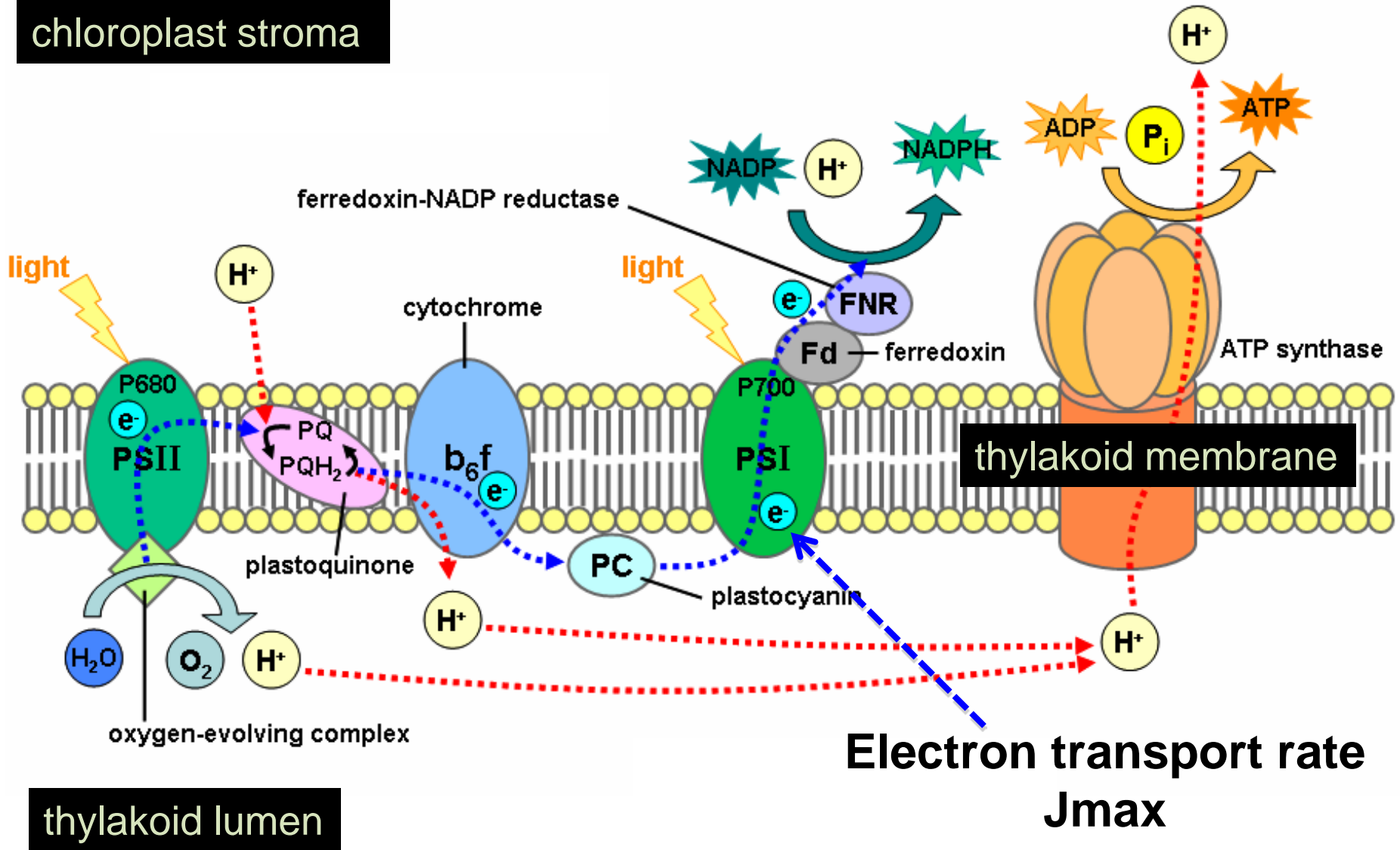
# Photosynthesis – The Chloroplast





# Definition: $J_{max}$ – electron transport rate

chloroplast stroma



thylakoid lumen

## Background:

$V_{(c)\max}$ : Measurement of process by which Rubisco catalyzes RuBP with  $\text{CO}_2$  to produce the carbon compounds that eventually become triose phosphates (G3P, PGAL)


Triose phosphates are the building block for sugars and starches.

$J_{\max}$ : Transport of electrons through the thylakoid membrane is critical to producing NADPH and ATP, which provide the metabolic energy necessary to produce triose phosphates.

The logo for FERST (Forest Ecosystem Remote Sensing Team) features a stylized, dark silhouette of a mountain range against a dark background.

**FERST**

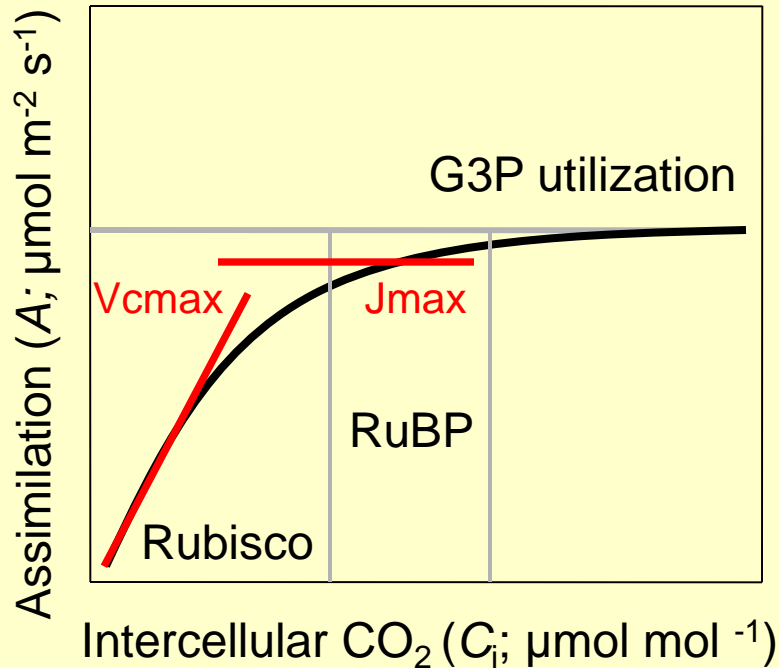
FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

The background of the slide is a scenic photograph of a mountain range. The foreground shows a dense forest of evergreen trees, while the middle ground and background consist of rolling, forested hills and mountains under a clear sky. A thin yellow horizontal line is positioned above the text in the bottom right section.



# Biochemical modeling of photosynthesis

$$A_n = \min(A_c, A_j, A_p) - R_d$$



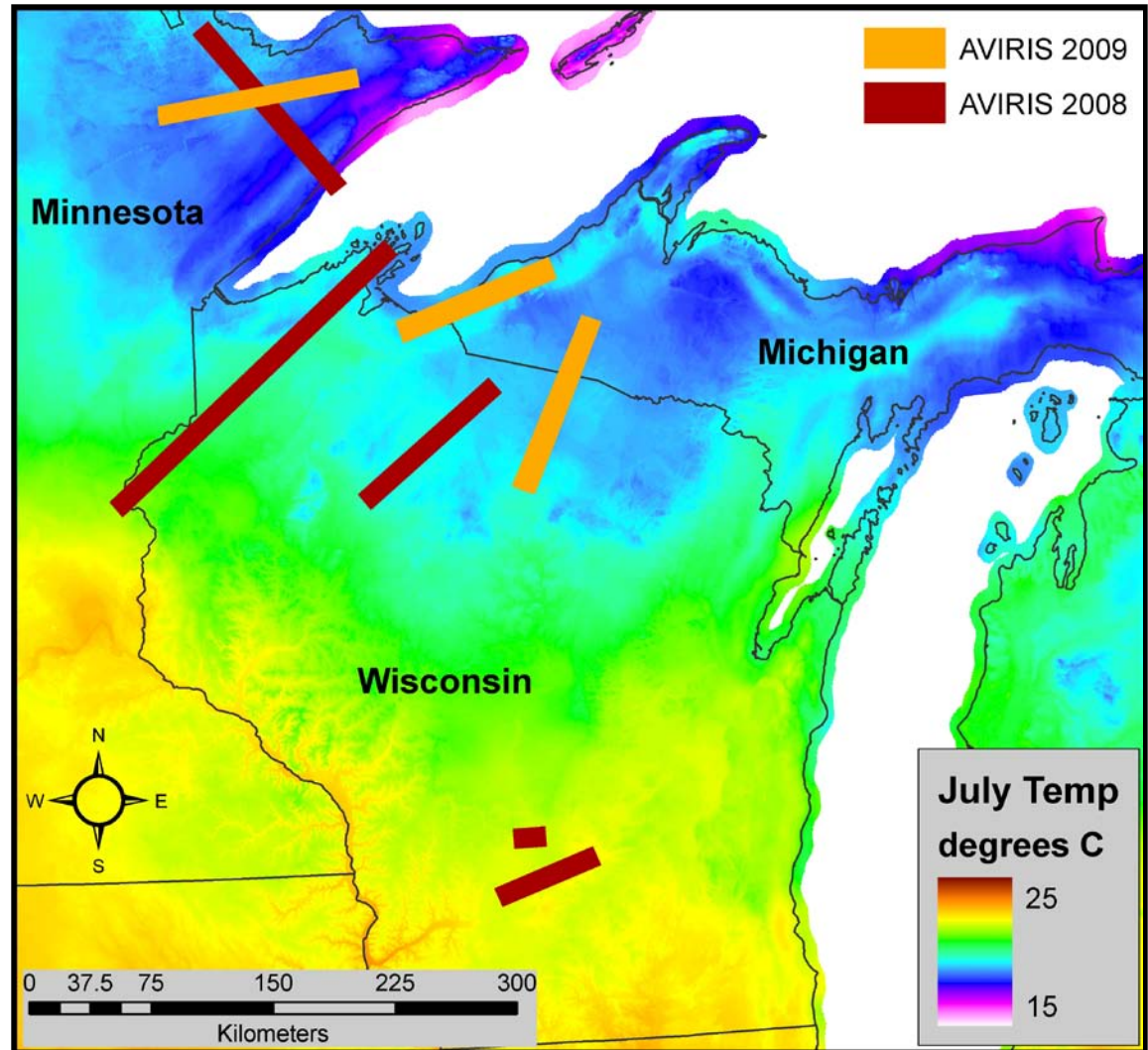
- Limited by
  - Rubisco
  - RuBP regeneration
  - triose phosphate utilization
- Determine key metabolic variables
  - **Vcmax**: Rubisco activity
  - **Jmax**: Electron transport

## FERST

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

# How will climate change affect composition and metabolism?

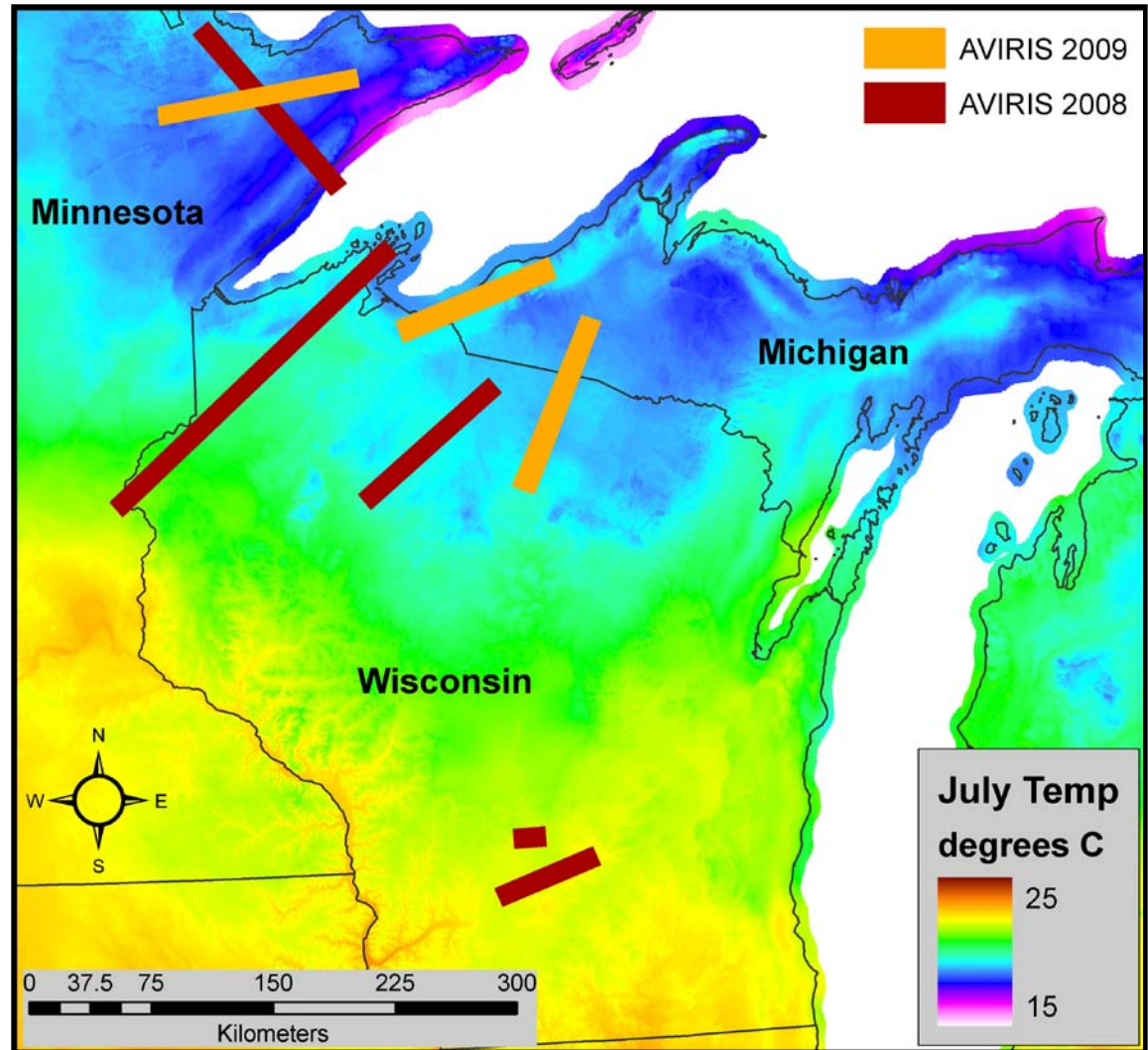
- Across the range of a species\*\*
- Photosynthetic capacity varies according to climate
- Changes in climate should be expressed in changes in rates ( $V_{cmax}$ ,  $J_{max}$ )



PRISM Data: <http://www.prism.oregonstate.edu/>

# How will climate change affect composition and metabolism?

- **Hyperspectral imagery**
- Field collection
  - Gas exchange
  - Spectra
  - **Canopy temperature**
- Examine regional trends
  - Lat/Long variation



PRISM Data: <http://www.prism.oregonstate.edu/>



## Where does HypsIRI fit in?

HypsIRI spectral and thermal measurements provide the opportunity to directly measure the photochemical processes associated with carbon assimilation (e.g.,  $A_{\max}$ ) and respiration ***by plants across the ranges of species.***

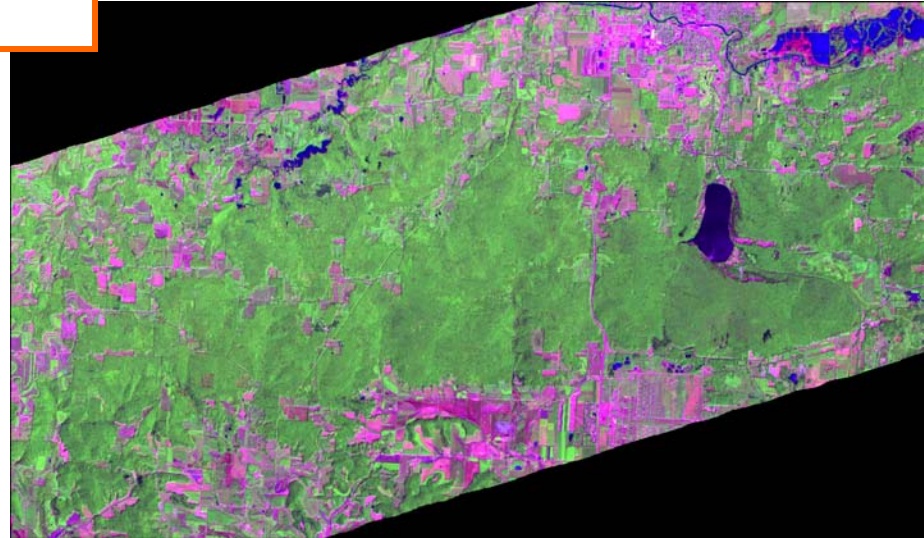
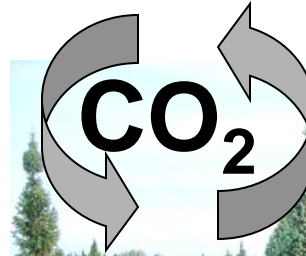
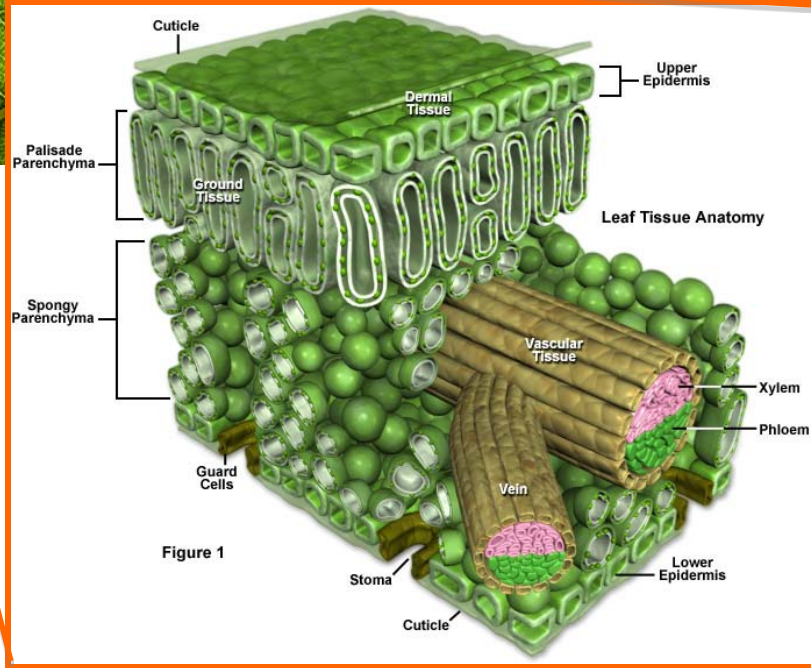
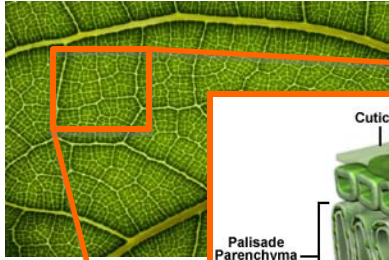
These HypsIRI products provide the potential to identify changes in photosynthetic processes associated with climate change (e.g., temperature) across species.



**FERST**

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

# Detection of leaf metabolic rates using spectroscopy





# Physiological data in glasshouse study



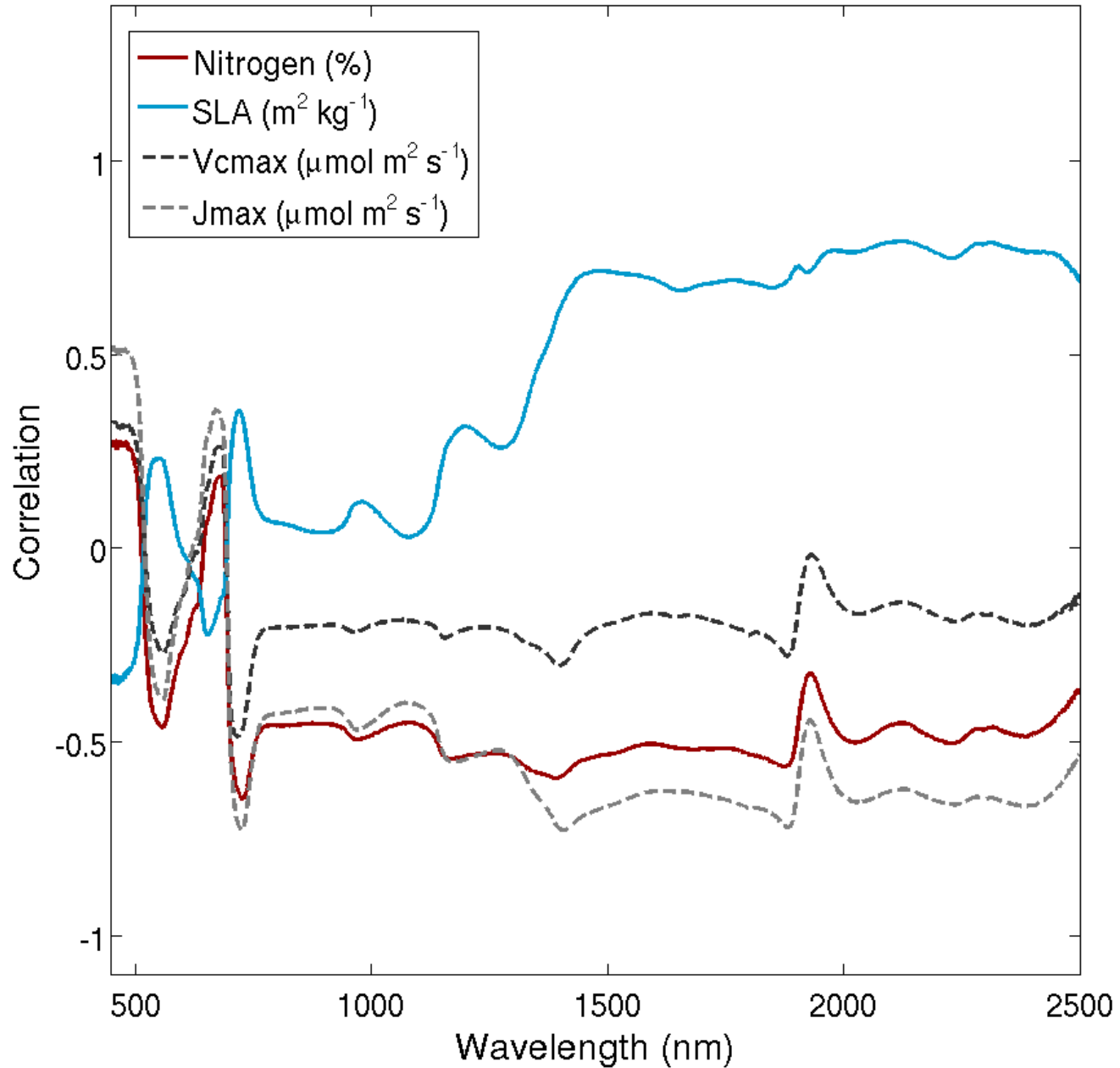
- Three temperature regimes
  - 13/20 ° C, 18/25 ° C, 23/30 ° C
- Leaf gas exchange
  - $V_{cmax}$ ,  $J_{max}$ ,  $A_{mass}$ ,  $A_{area}$
- Morphology and nutrition
  - SLA, Leaf N
- Leaf optical properties (350-2500 nm)

## FERST

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON

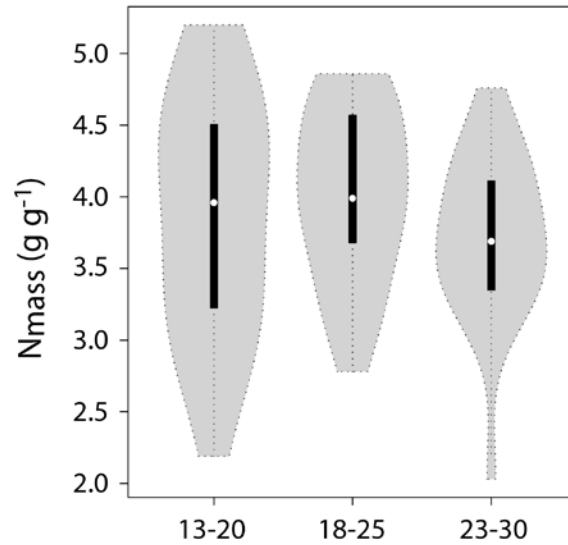


# Empirical evidence: Cottonwood and Aspen

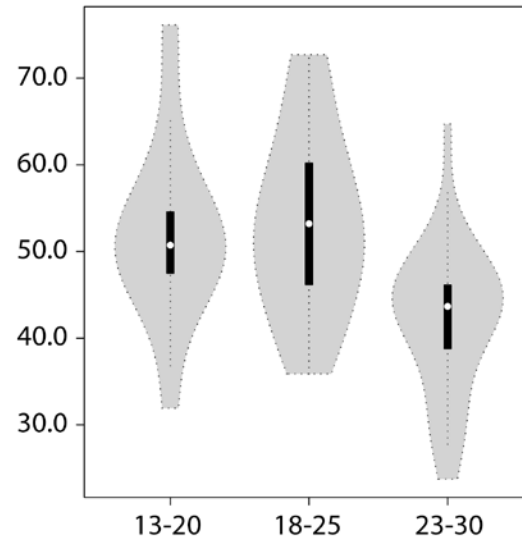


# Physiological measurements across temperature regimes

N (mass)

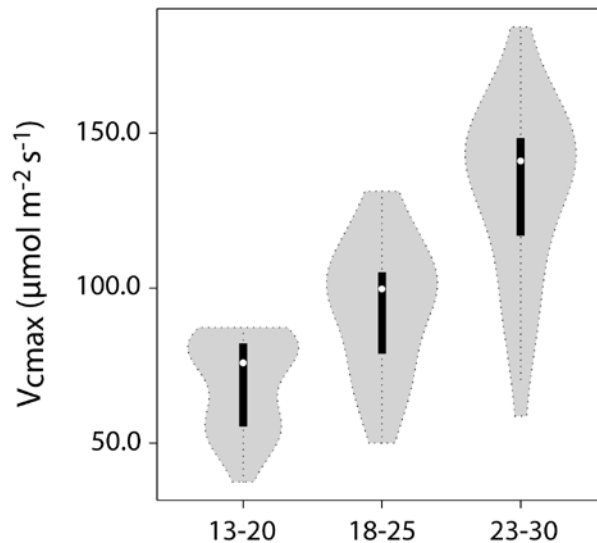


Marea (g m<sup>-2</sup>)

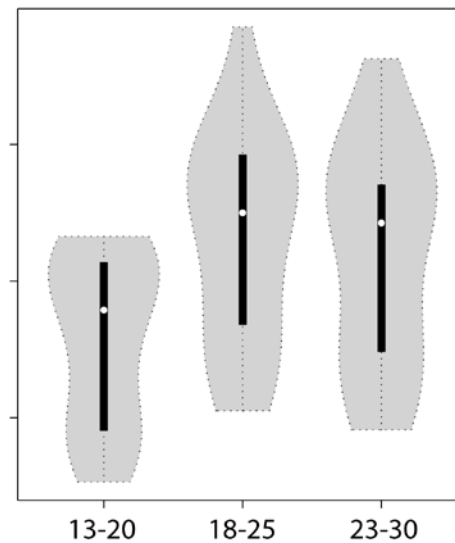


LMA

V(c)max



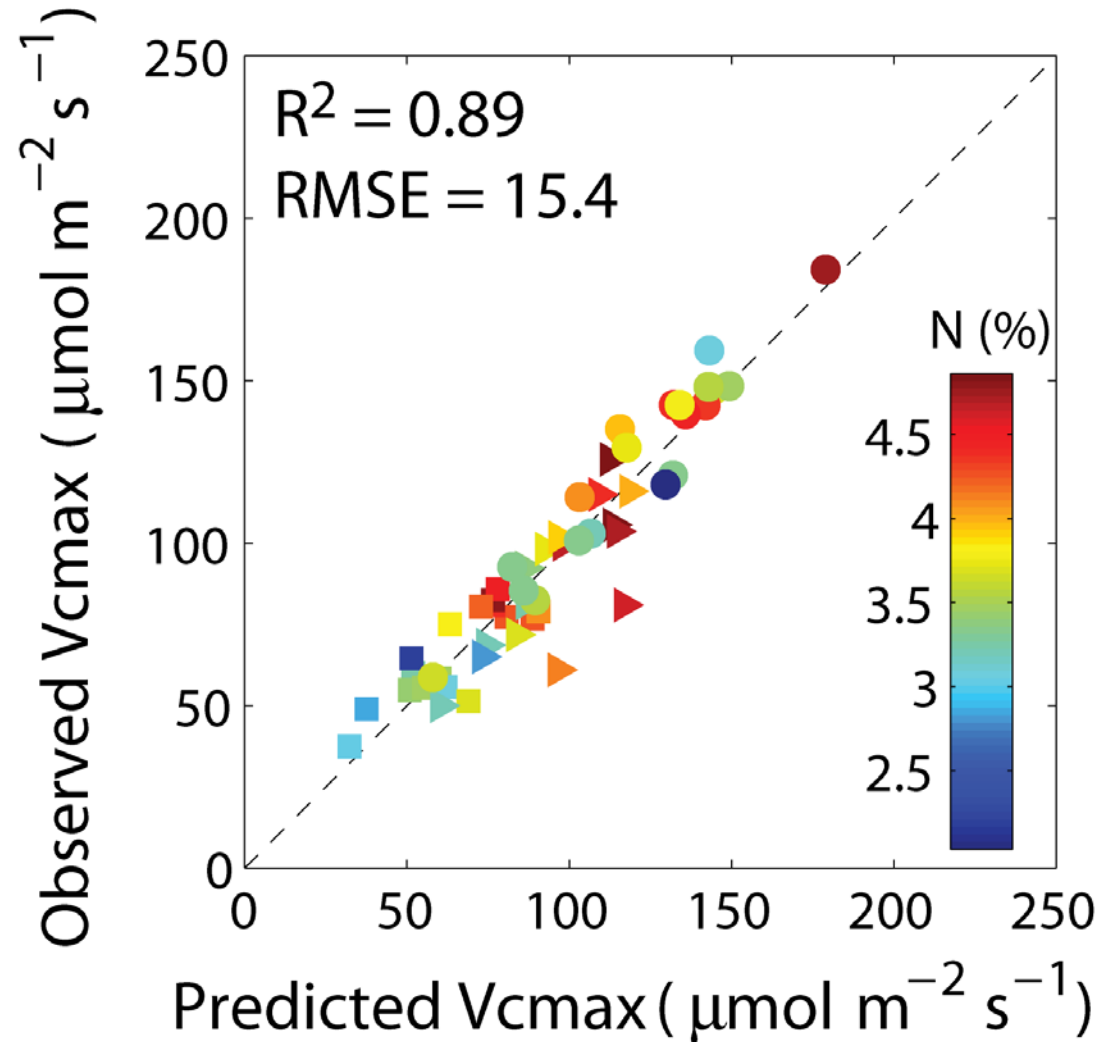
Jmax (μmol m<sup>-2</sup> s<sup>-1</sup>)



Jmax

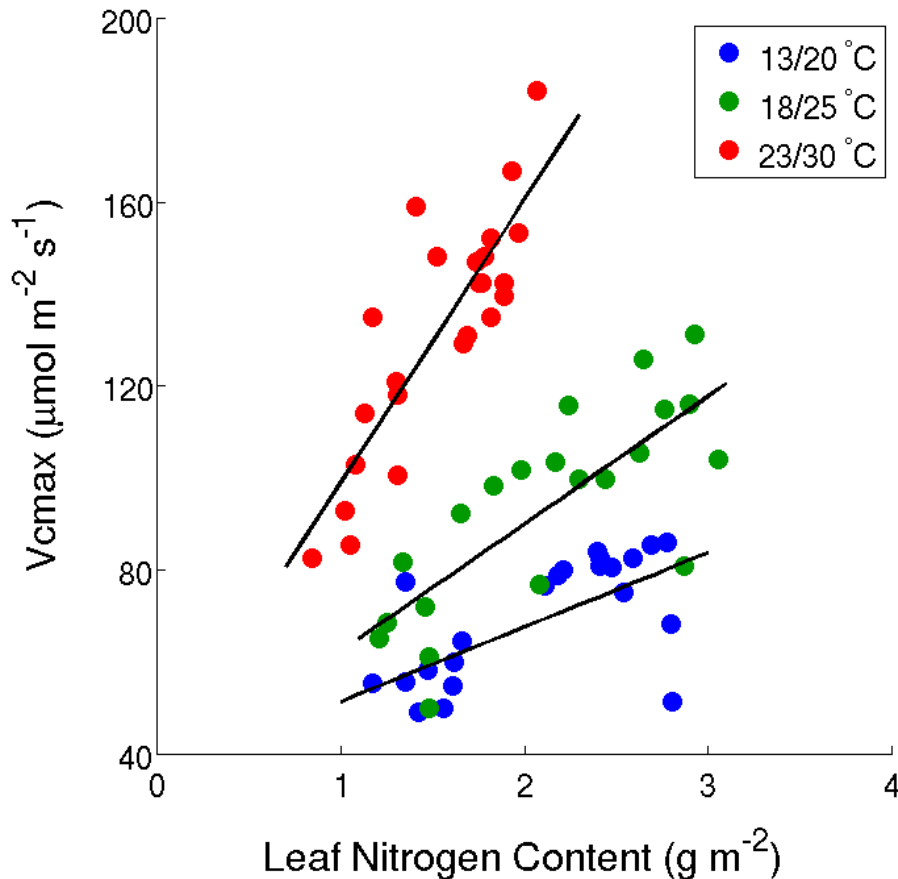
Night – Day Temperature

# Predictions using leaf spectra and PLSR (%N example)

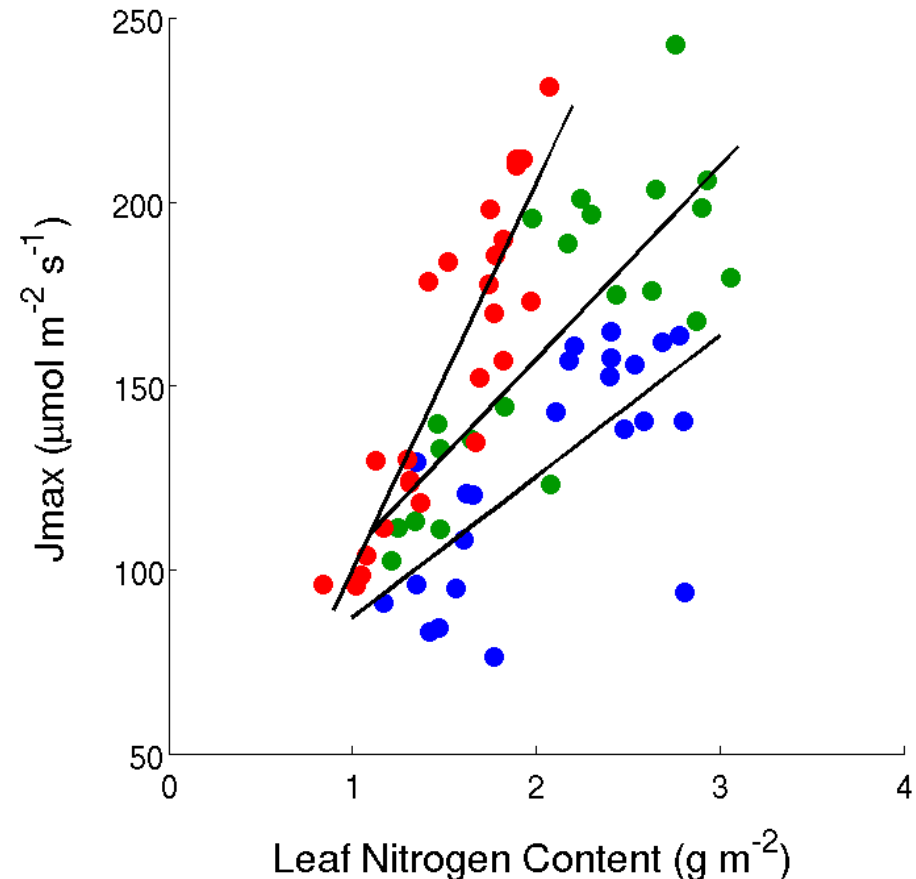




# Biotron measurements show thermal effects on leaf metabolism



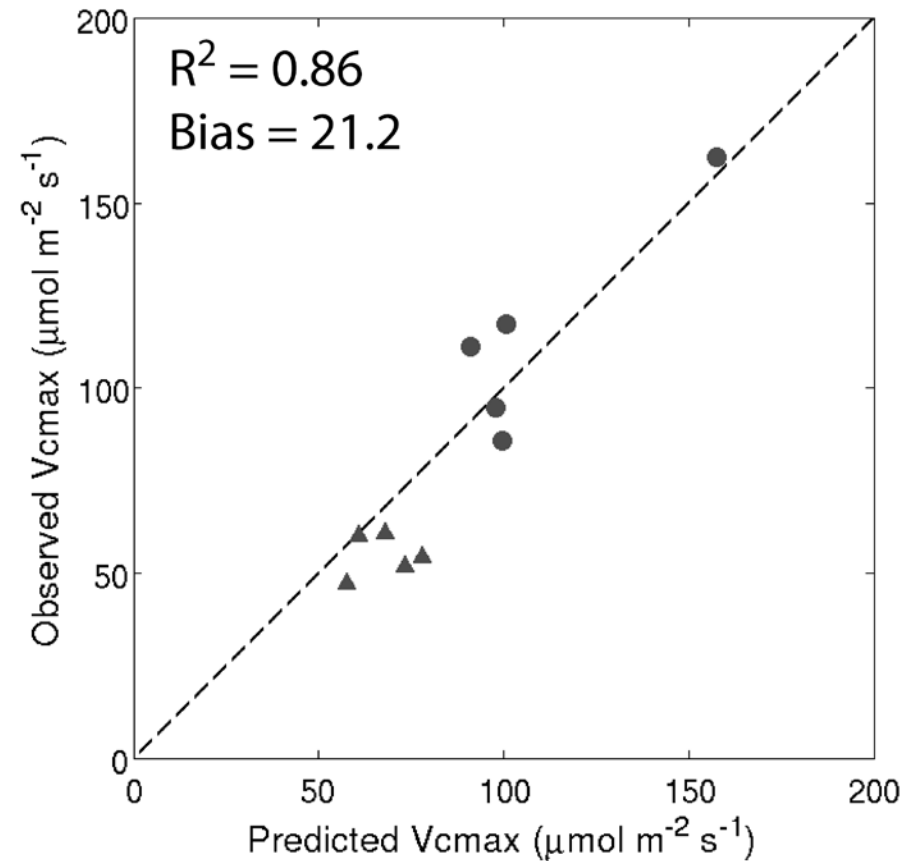
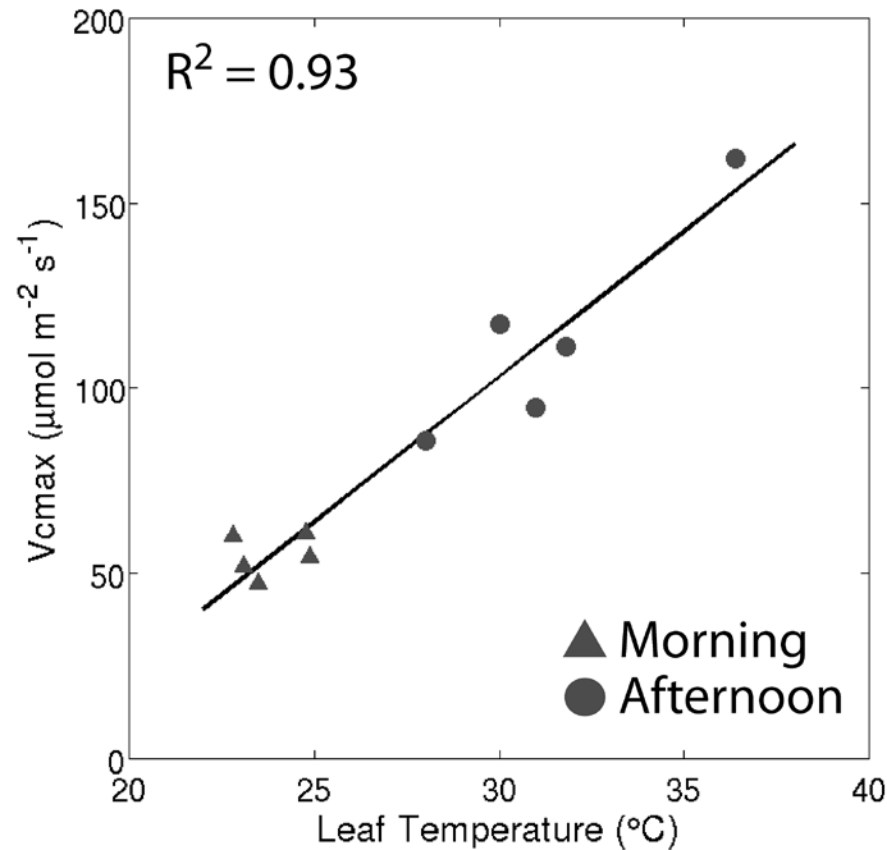
$$R^2 = 0.003$$



$$R^2 = 0.33$$

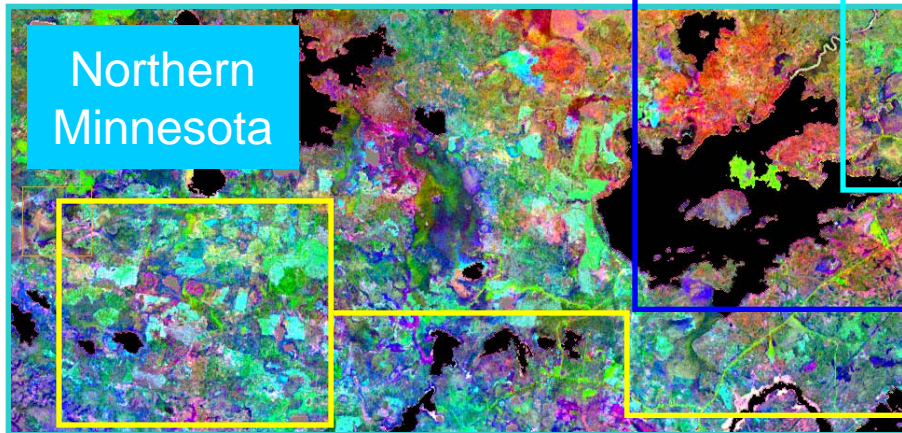
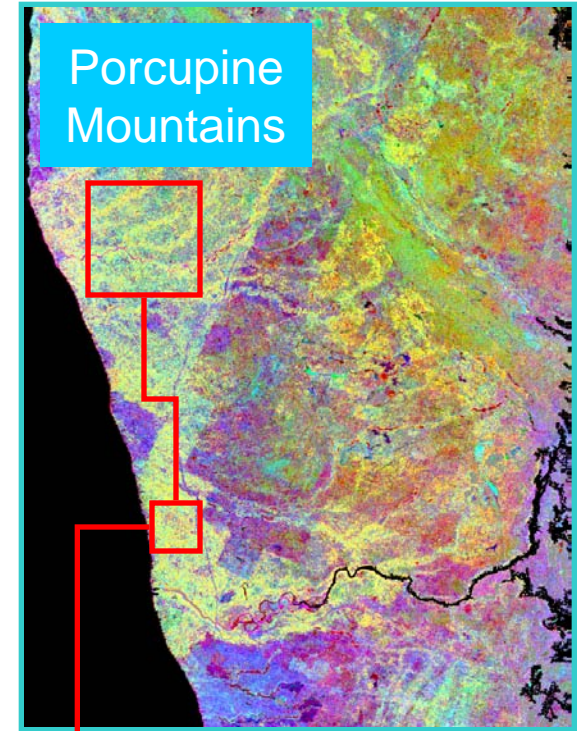
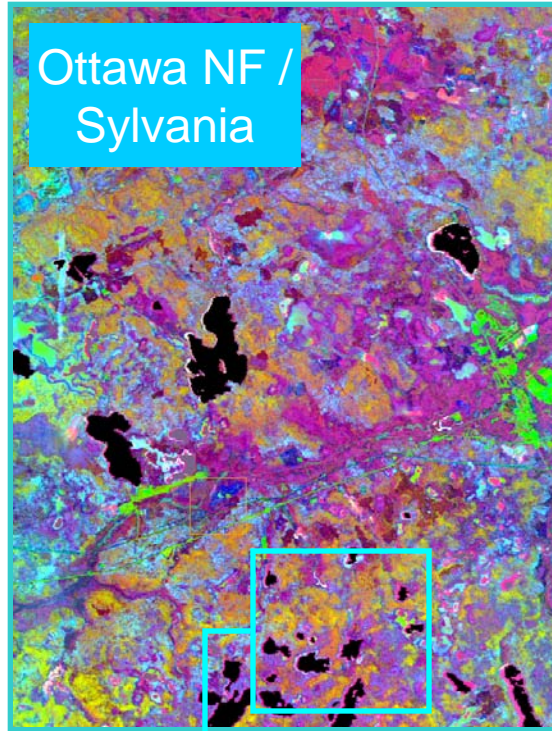
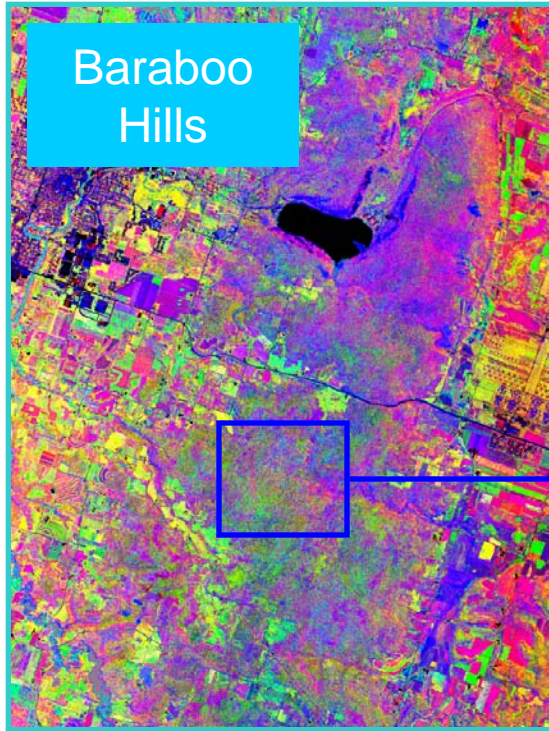
Pooled  $R^2$  between spectra-predicted  $V(c)\max/J_{\max}$  and leaf N

# Spectra are responsive to temp.-driven variations in metabolism



Time	Tleaf ( $^{\circ}\text{C}$ )	Vcmax
Morning	23.8	54.8
Afternoon	31.4	114.3

# Examples: AVIRIS imagery from the Upper Midwest



Old growth hemlock / Hwd

Northern hardwood

Oak / hickory

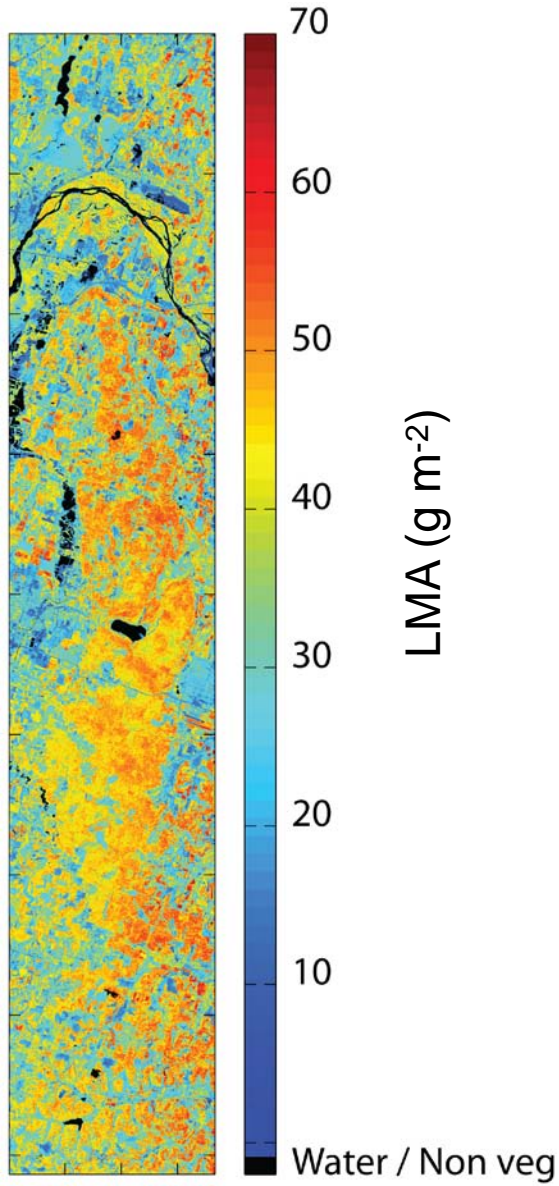
Boreal forest



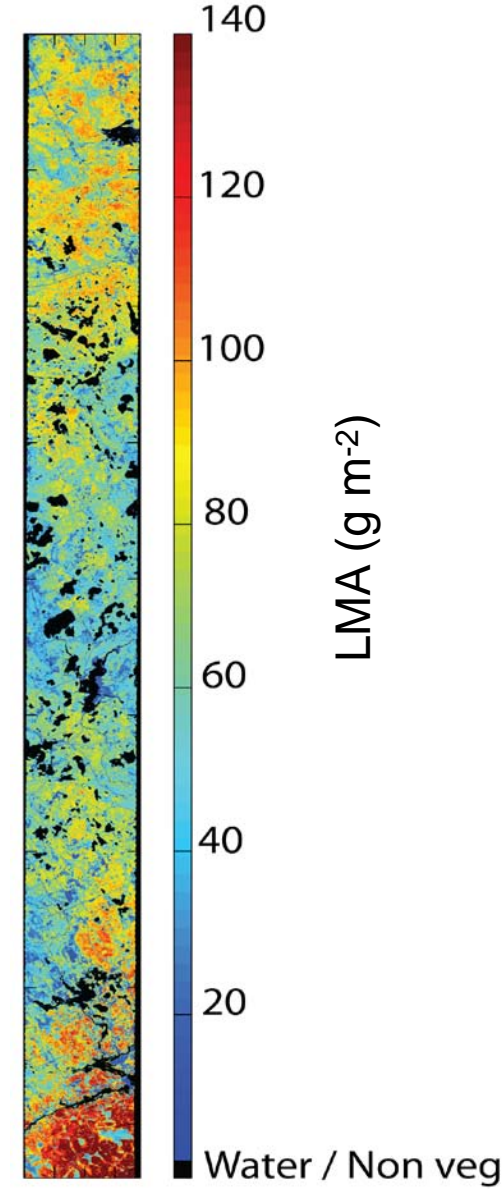


# Examples: LMA – based on hypothesized relationships

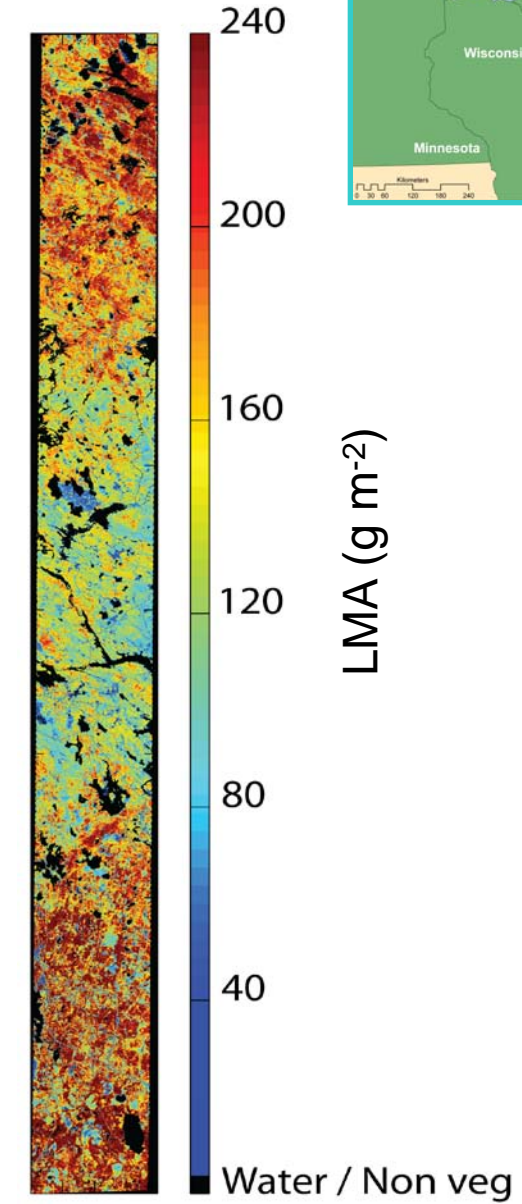
Baraboo Hills



Ottawa NF



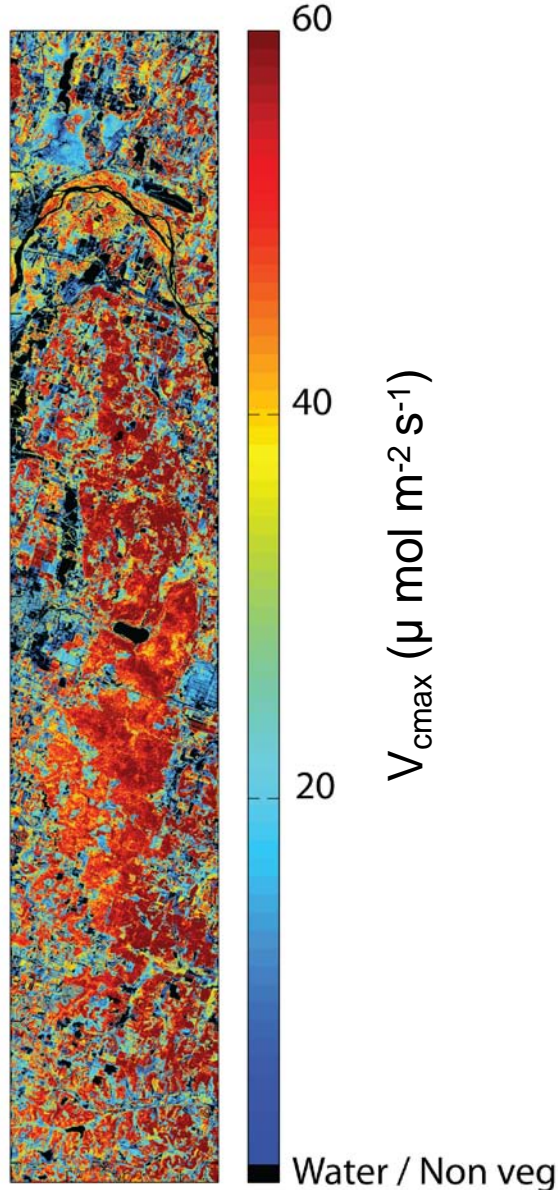
Minnesota



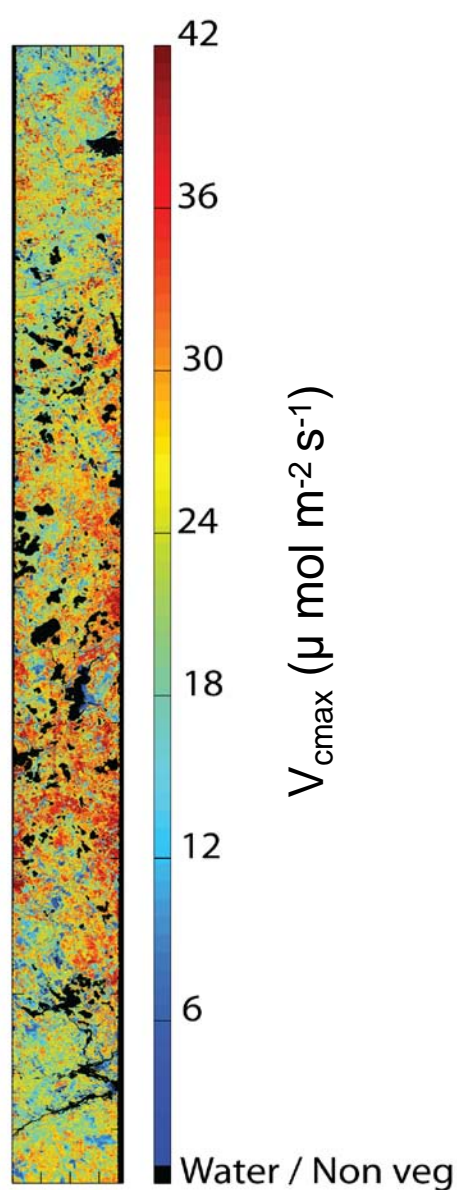


# Examples: $V_{cmax}$ – based on hypothesized relationships

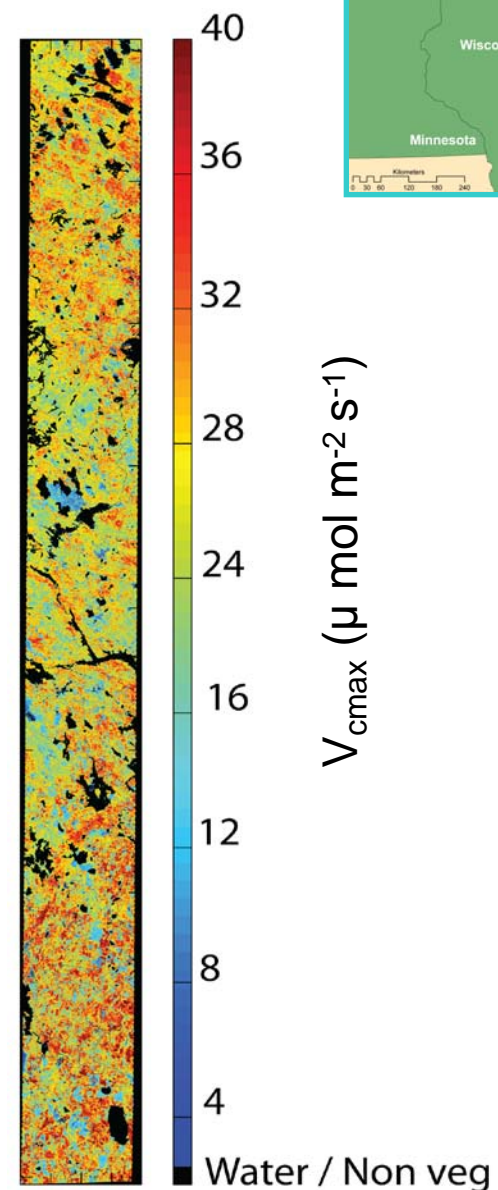
Baraboo Hills



Ottawa NF

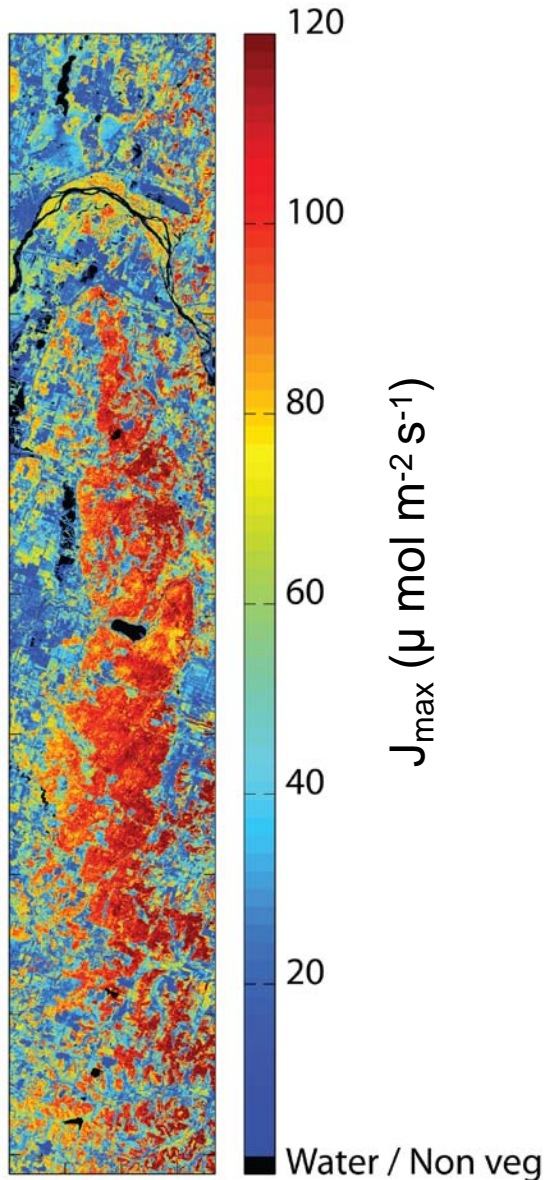


Minnesota

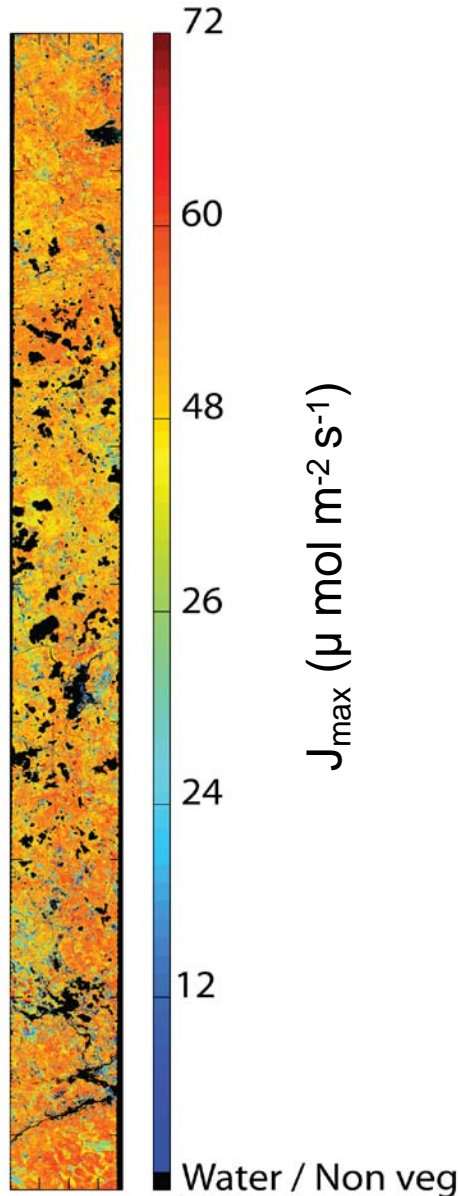


# Examples: $J_{\max}$ – based on hypothesized relationships

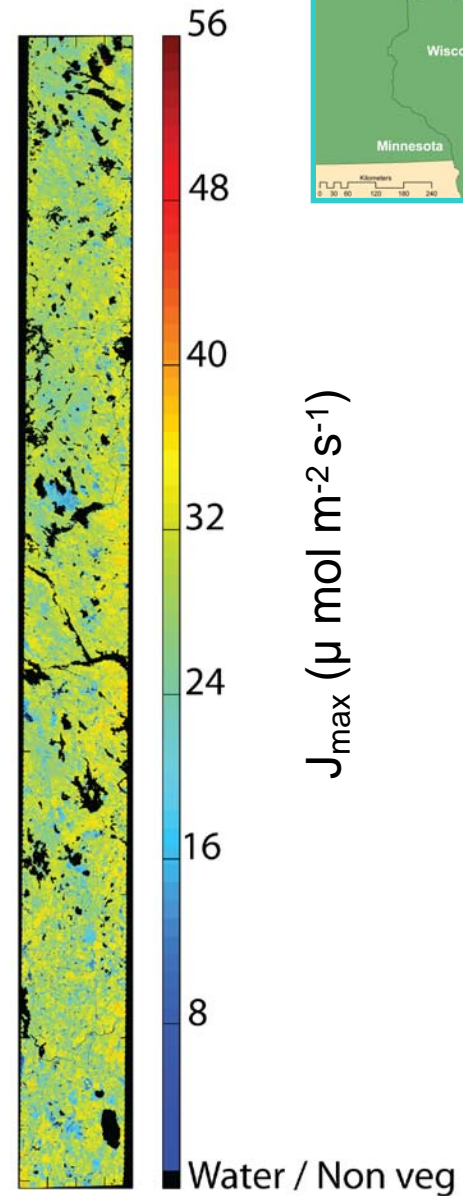
## Baraboo Hills



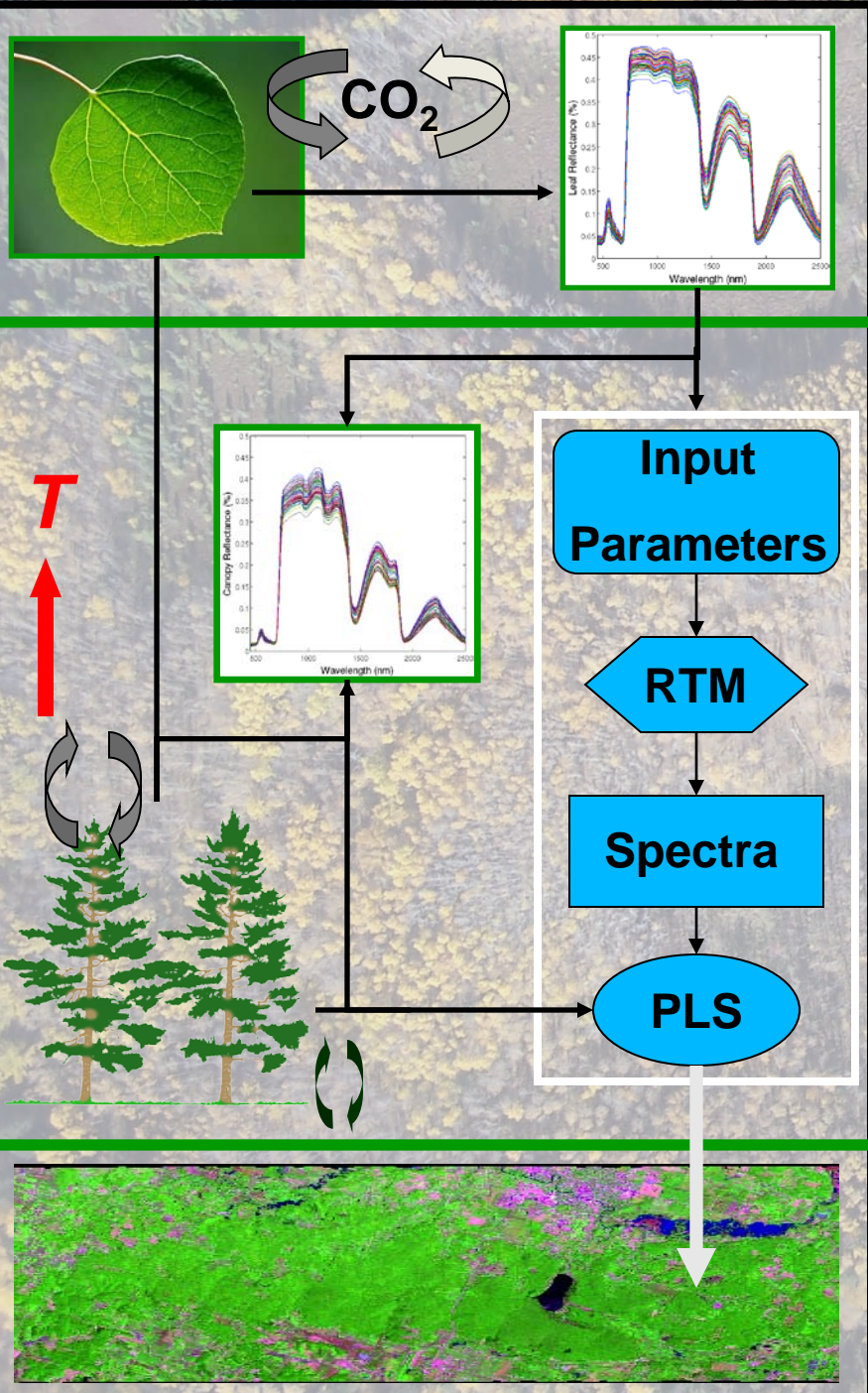
## Ottawa NF



## Minnesota

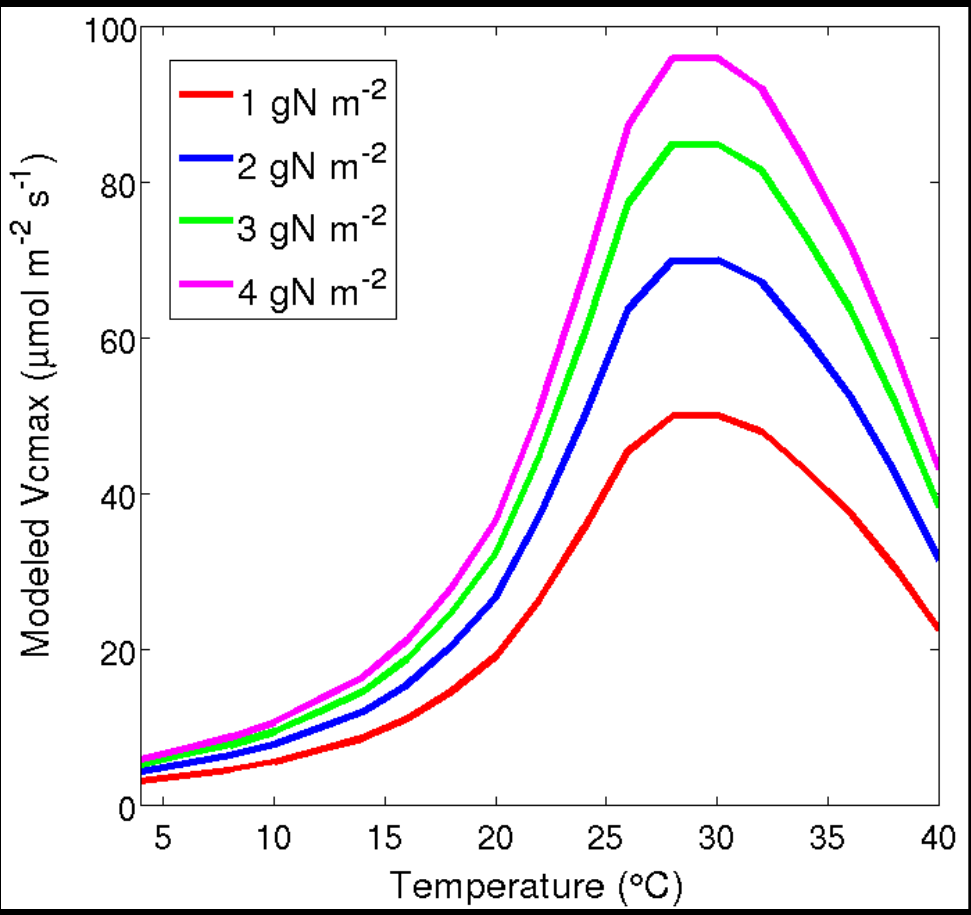






Now working on scaling leaf  $\rightarrow$  canopy  $\rightarrow$  sensor

Using HypsIRI-like data (AVIRIS + ASTER/MASTER), we are looking at forest acclimation to  $T$  and  $CO_2$ .



# Remote sensing of genetic diversity in aspen:

Directly associated with vegetation response to climate change

Remote Sensing

Multispectral and hyperspectral data

Genetic diversity

Aspen genotype A

Aspen genotype B

Canopy chemistry

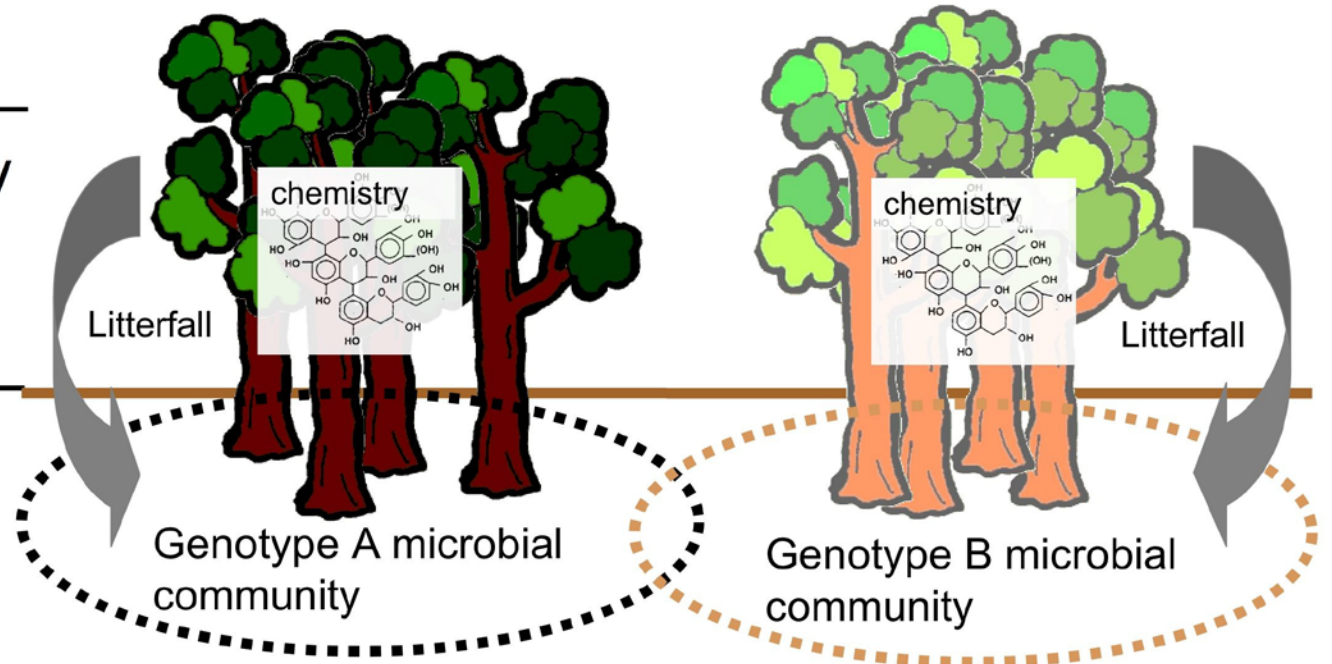
Litterfall

Litterfall

Microbial community

Genotype A microbial community

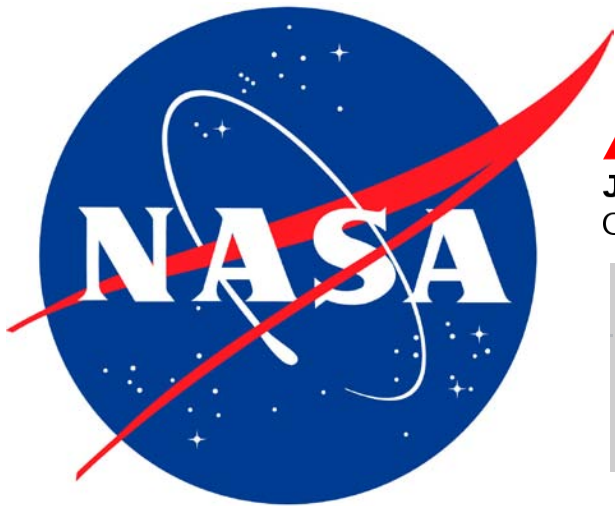
Genotype B microbial community





# Acknowledgments

- Terrestrial Ecology and Biodiversity Program
- Earth & Space Science Fellowship
- HypsIRI Preparatory Activities

A background image of a mountainous landscape with green hills and a winding road, overlaid with a yellow horizontal line.

## FERST

FOREST ECOSYSTEM REMOTE SENSING TEAM  
DEPARTMENT OF FOREST AND WILDLIFE ECOLOGY  
UNIVERSITY OF WISCONSIN - MADISON