## Importance of Mesophyll Diffusion of CO<sub>2</sub> for Modeling Terrestrial Carbon Cycle

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# Outline

1 Overview of Global Carbon Cycle Concepts, trends, uncertainties

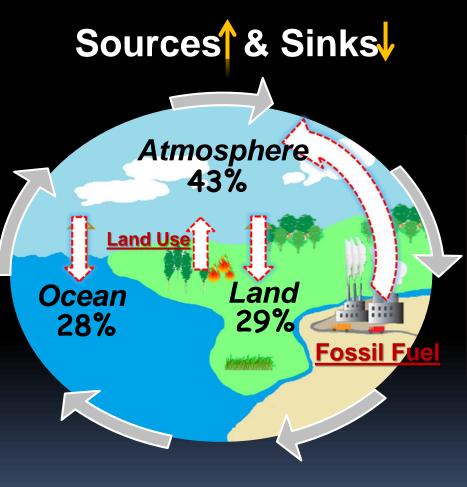
### 2 Photosynthesis and Mesophyll Diffusion Mechanisms and modeling at leaf scale

Global Impact of Mesophyll Diffusion CO<sub>2</sub> fertilization of vegetation productivity on land



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# Carbon Cycling and Partitioning



### Global Anthropogenic CO<sub>2</sub> Budget

	1750–2011 Cumulative PgC
Atmospheric Increase <sup>a</sup>	240 ± 10 <sup>r</sup>
Fossil fuel combustion and cement production <sup>b</sup>	375 ± 30'
Ocean-to-atmosphere flux <sup>c</sup>	-155 ± 30'
Land-to-atmosphere flux 30 ± 45' Partitioned as follows	
Net land use change <sup>d</sup>	180 ± 80 <sup>tg</sup>
Residual land sink <sup>e</sup>	$-160 \pm 90'$

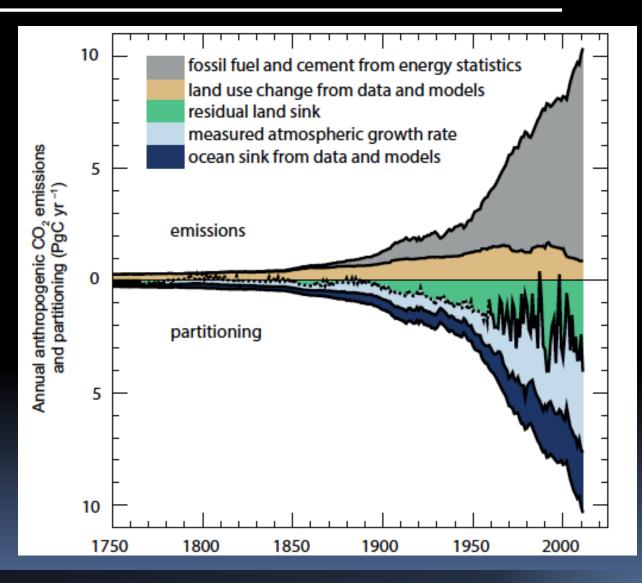
(IPCC AR5)

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**Mesophyll Diffusion in Carbon Cycles** 

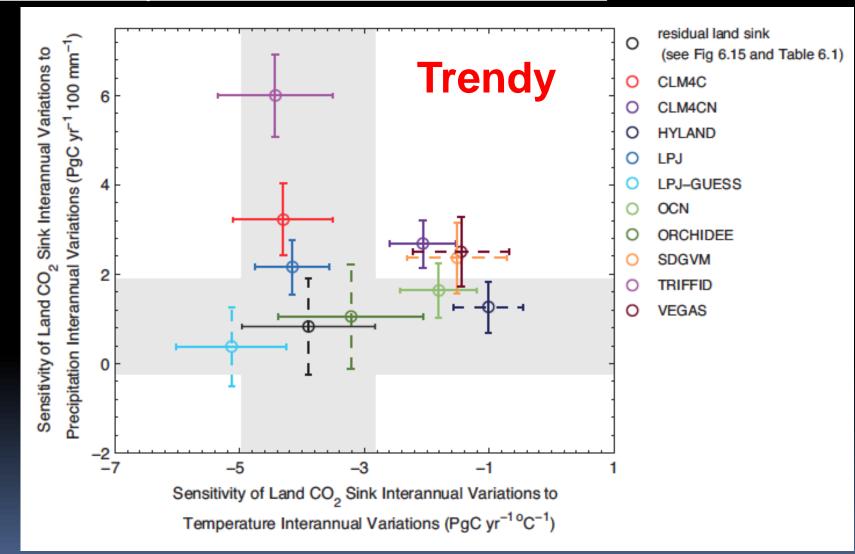
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# Trend of Carbon Partitioning



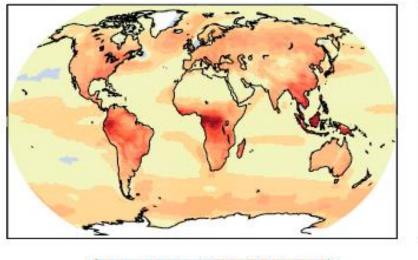
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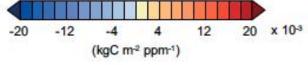
## Large Uncertainty of Land C Sink to Climate by model simulation (historical)



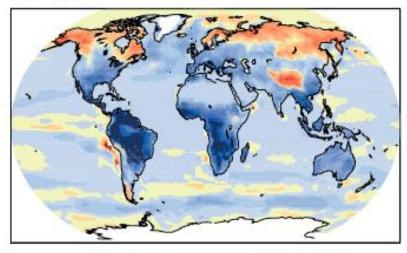
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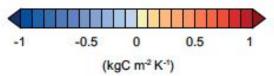
a. Regional carbon-concentration feedback

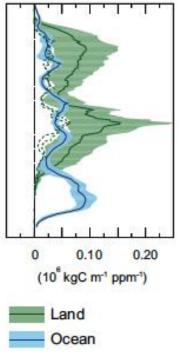


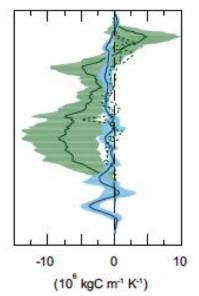


b. Regional carbon-climate feedback





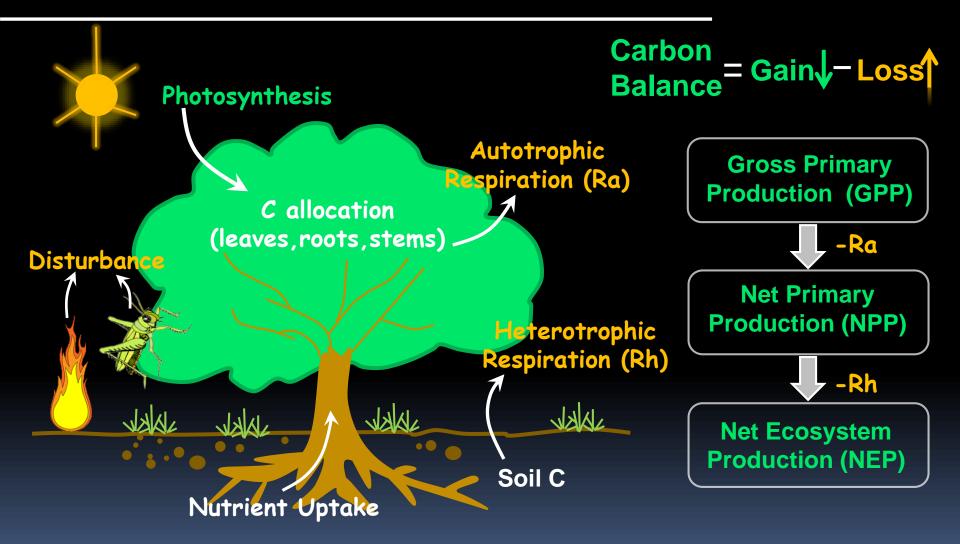




CMIP5

Large Uncertainty of Land C Sink to  $CO_2$ increase and Climate (Projection)

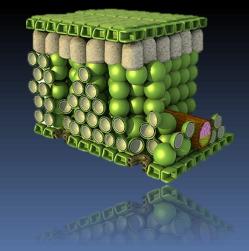
## **Terrestrial Carbon Cycle: Concepts**



Dickinson, 2012; Bonan, 2008

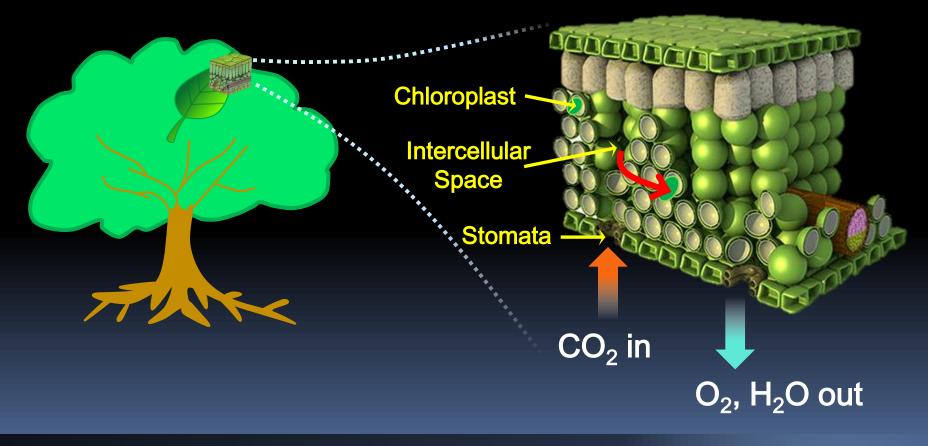
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# Photosynthesis and Mesophyll Diffusion



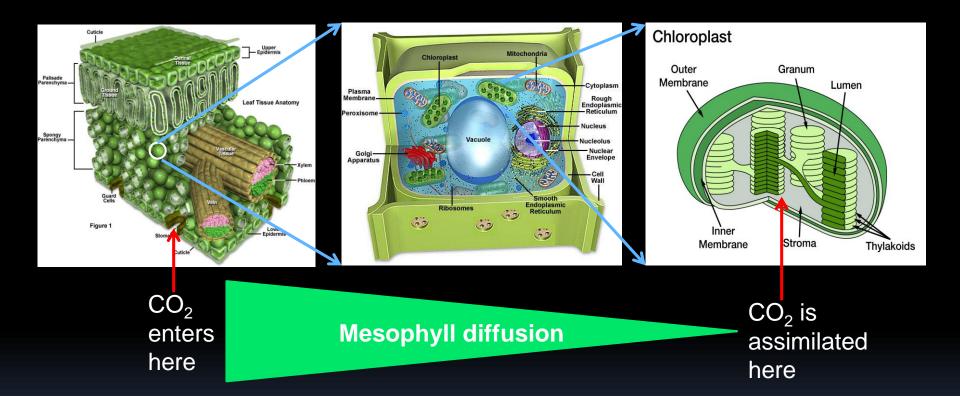
# Mesophyll Diffusion of CO2

Mesophyll Diffusion:(Niinemets, 2009)CO2 diffusion from Intercellular to Chloroplast



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# CO<sub>2</sub> is assimilated in the stroma inside the chloroplasts



### <u>Current carbon cycle models predict photosynthesis as if CO<sub>2</sub> was</u> <u>assimilated inside the substomatal cavities</u>

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### Stomatal diffusion vs. mesophyll diffusion

**Stomatal diffusion:** Gas phase only

<u>Mesophyll diffusion</u>: Liquid and lipid phases – cell walls, plasmalemma, cytosols, chloroplast envelopes, and stroma

CO<sub>2</sub> diffusion in liquids and lipids is several orders of magnitude <u>slower than</u> in air

Medium	Diffusivity (m <sup>2</sup> s <sup>-1</sup> )
Air	1.381 × 10 <sup>-5</sup>
Cell wall	1.7 × 10 <sup>-9</sup>
Plasmalemma	10 <sup>-14</sup> - 10 <sup>-11</sup>
Cytosol	1.7 × 10 <sup>-9</sup>
Chloroplast envelope	10 <sup>-14</sup> - 10 <sup>-11</sup>
Stroma	1.7 × 10 <sup>-9</sup>

### CO<sub>2</sub> diffusivity in different media

Mesophyll layers constitute a major barrier for CO<sub>2</sub> movement inside leaves

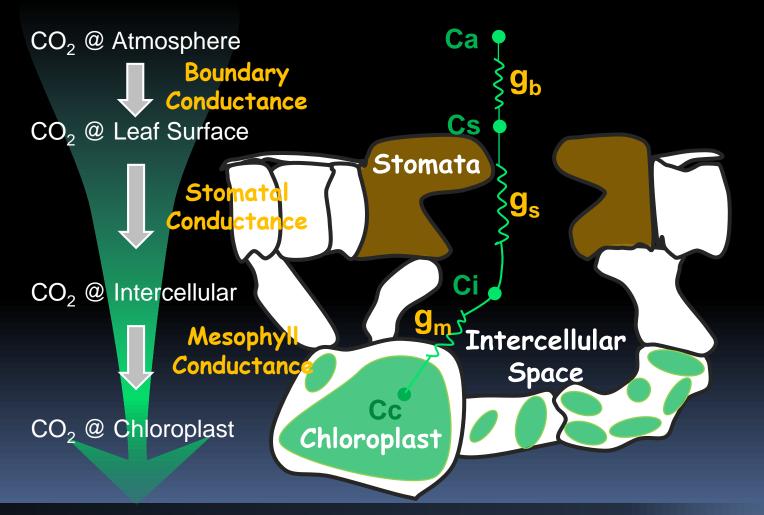
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## Journey of $CO_2$ inside C3 Plant Leaves

### CO<sub>2</sub> drawdown



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### Methods of determining mesophyll conductance

### Chlorophyll fluorescence

- Variable J (Harley et al. 1992; Gu and Sun 2013)
- Constant J (Harley et al. 1992)
- Online carbon isotope discrimination (Evans et al. 1986; Gu and Sun 2013)
- Fitting of leaf gas exchange measurements (A/Ci Curve fitting; Ethier and Livingston 2004; Gu et al. 2010)
  - LeafWeb (leafweb.ornl.gov)

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### Photosynthesis Model

The Photosynthesis Model Farquhar, 1980  $A = \min(A_c, A_j, A_p)$   $A_c$ : Rubisco-limited ( $V_{cmax}$ )  $A_j$ : RuBP regeneration-limited ( $J_{max}$ )  $A_p$ : Export-limited (TPU)

A Variant Photosynthesis Model (co-limilation)

$$aA_i^2 - (A_c + A_j)A_i + A_cA_j = 0$$
  
$$bA^2 - (A_i + A_p)A + A_iA_p = 0$$

$$\begin{split} A_{c} &= \begin{cases} \frac{V_{c\max}\left(c_{i} - \Gamma_{*}\right)}{c_{i} + K_{c}\left(1 + o_{i}/K_{o}\right)} & \text{for } \mathrm{C}_{3} \text{ plants} \\ V_{c\max} & \text{for } \mathrm{C}_{4} \text{ plants} \end{cases} \\ A_{j} &= \begin{cases} \frac{J\left(c_{i} - \Gamma_{*}\right)}{4c_{i} + 8\Gamma_{*}} & \text{for } \mathrm{C}_{3} \text{ plants} \\ \alpha(4.6\phi) & \text{for } \mathrm{C}_{4} \text{ plants} \end{cases} \\ A_{p} &= \begin{cases} 3T_{p} & \text{for } \mathrm{C}_{3} \text{ plants} \\ \kappa_{p} \frac{C_{i}}{P_{atm}} & \text{for } \mathrm{C}_{4} \text{ plants} \end{cases}. \end{split}$$

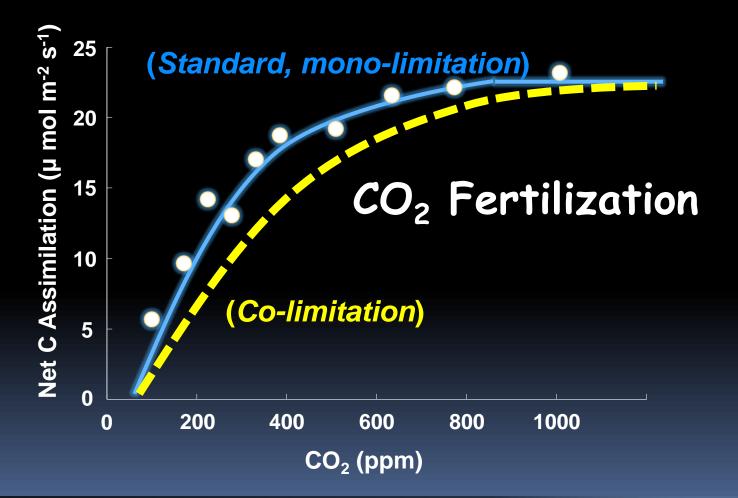
$$A = f(V_{cmax}, J_{max}, TPU, CO_2)$$

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### $CO_2$ Response Curve (A/C<sub>i</sub> Curve)



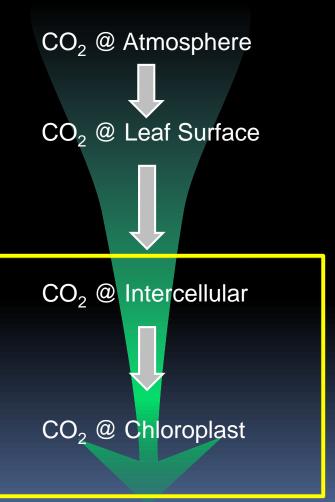
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$$A = f(V_{cmax}, J_{max}, TPU, C_i) \implies A = f(V_{cmax}, J_{max}, TPU, C_c)$$

### CO<sub>2</sub> drawdown



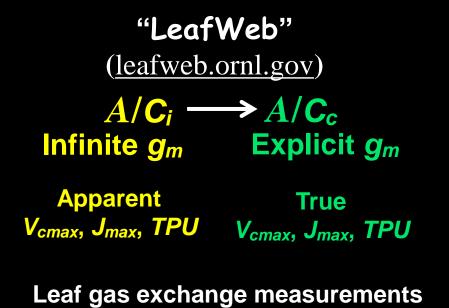
$$C_c = C_i - A_n / g_m$$
  
 $A_n$ : Net C Assimilation  
(= A - Rd)  
If infinite  $g_m$ ,  $C_c = C_i$   
Otherwise,  $C_c < C_i$   
By assuming an  
infinite value,  $g_m$  is  
omitted!

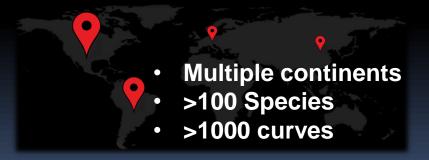
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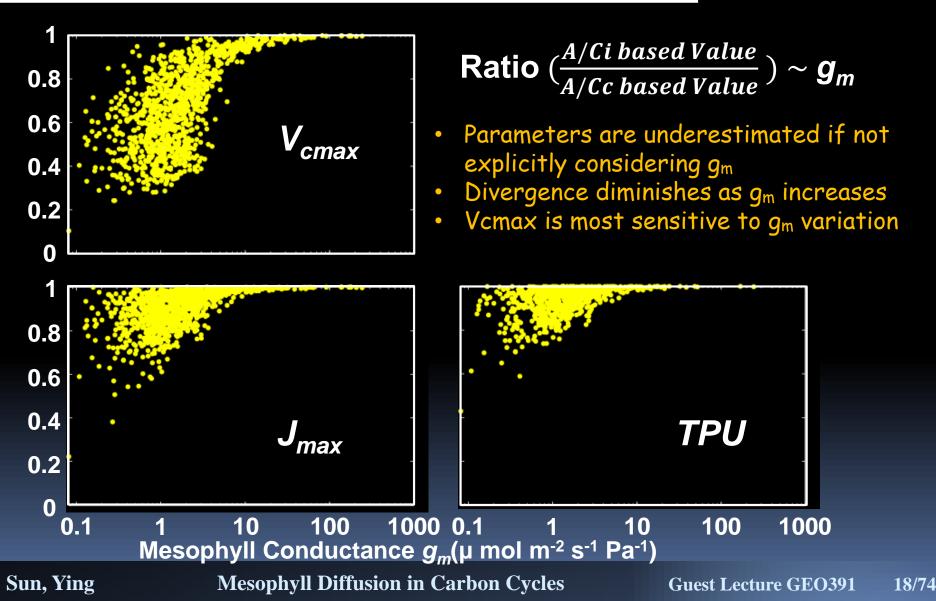
### Conversion of Fundamental Photosynthetic Parameters



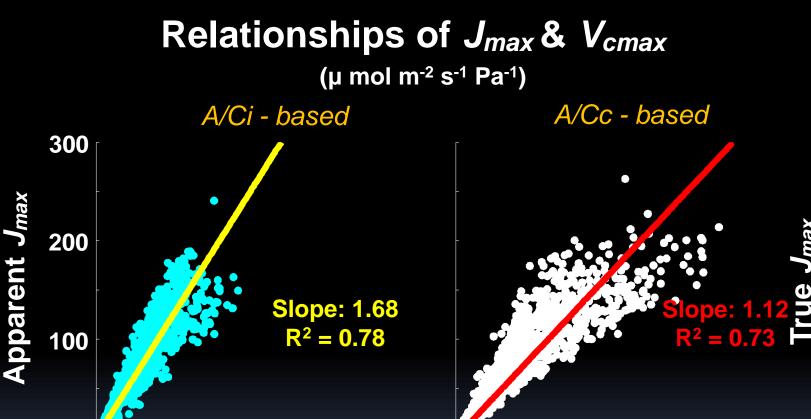


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# Omission of g<sub>m</sub> leads to underestimation of photosynthetic parameters



# The g<sub>m</sub> modifies functional relationships between parameters



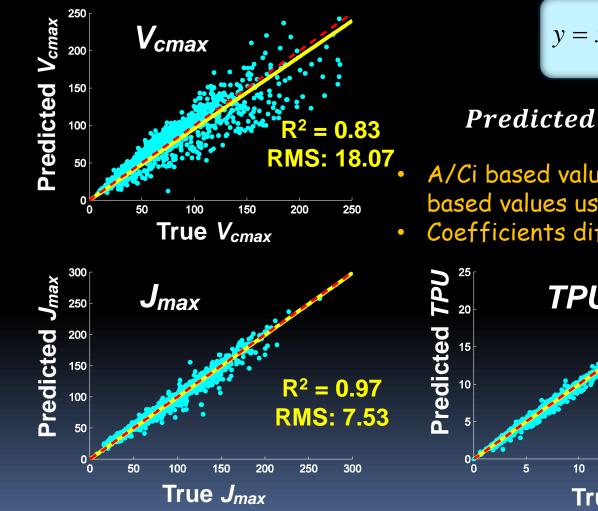
0
0
100
200
300
0
100
200
300
100
200
300
Crue V<sub>cmax</sub>
Crue V<sub>cmax</sub>

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# "True" parameters can be obtained from A/Ci-based values

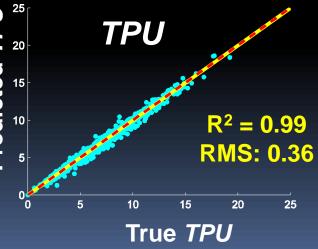


**Predicted Value** = f(A/CiValue, gm)

$$y = x \exp\left(a\frac{x^c}{g_m^b + d}\right)$$

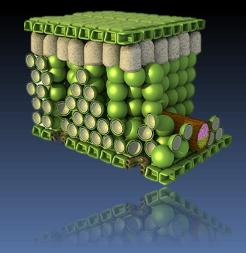
**Predicted Value** ~ A/CcValue

A/Ci based values can be converted to A/Cc based values using an empirical function Coefficients differ among Vcmax, Jmax, TPU



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# Global Impact of Mesophyll Diffusion



# A modeling framework for $g_m$

Leaf-level parameterization

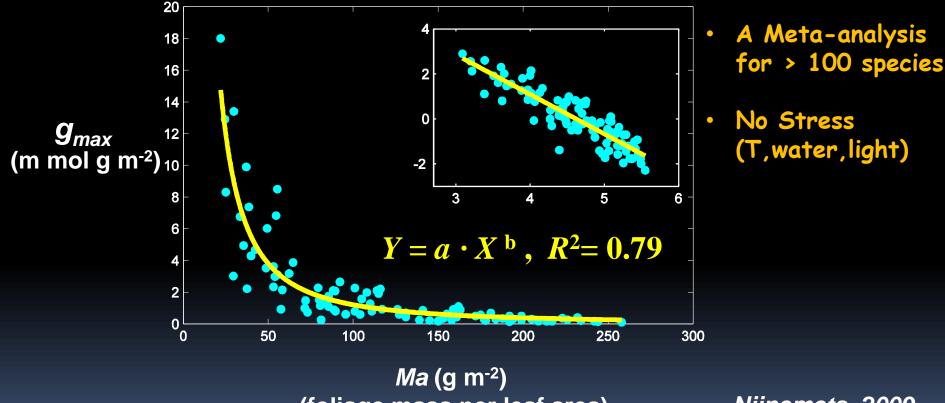
 $g_m = g_{max} \cdot f_T(T) \cdot f_w(\theta)$ 

- Scaling up to canopy level
  - Sunlit leaf
  - Shaded leaf
  - Vertical gradient

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## New Advances from field studies

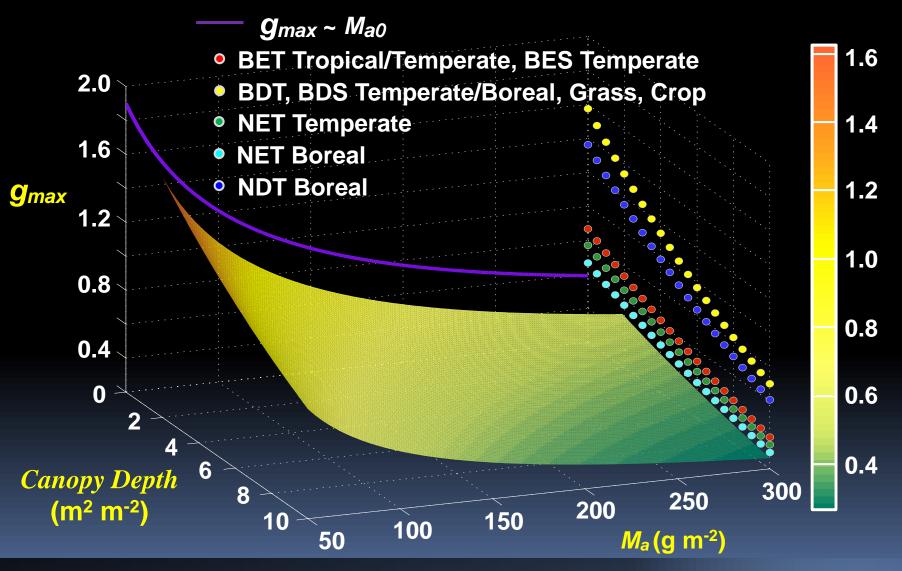
### Maximum $g_m$ (no stress)



Niinemets, 2009

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### Variation of gm with Ma & canopy depth



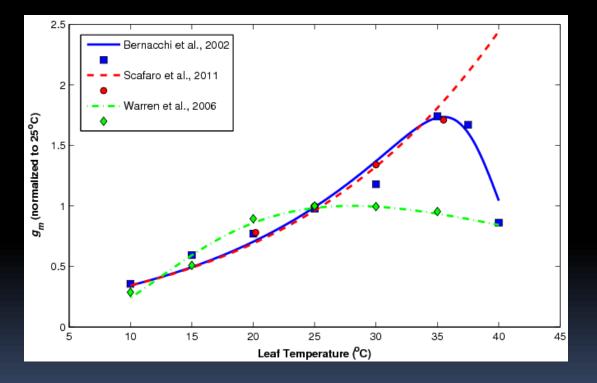
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## Environmental Modifiers

T Response Function
 Water Stress factor



- β<sub>tran</sub> Calculated
   in host model
   CLM4.5
- β<sub>tran</sub> Scaled to 0
   to 1

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# Implementation of global mesophyll conductance model in CLM4.5

### Structural Updates:

Inclusion of mesophyll conductance model Photosynthesis model based on Cc instead of Ci

#### Parameter Recalibration:

Transformation of apparent photosynthetic parameters ( $V_{cmax}$ ,  $J_{max}$  and *TPU*) to corresponding true values using "conversion function" developed by "LeafWeb"

### Pair Comparison:

Differences in dynamic behaviors between with and without explicit representation of mesophyll diffusion

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### Simulation protocols

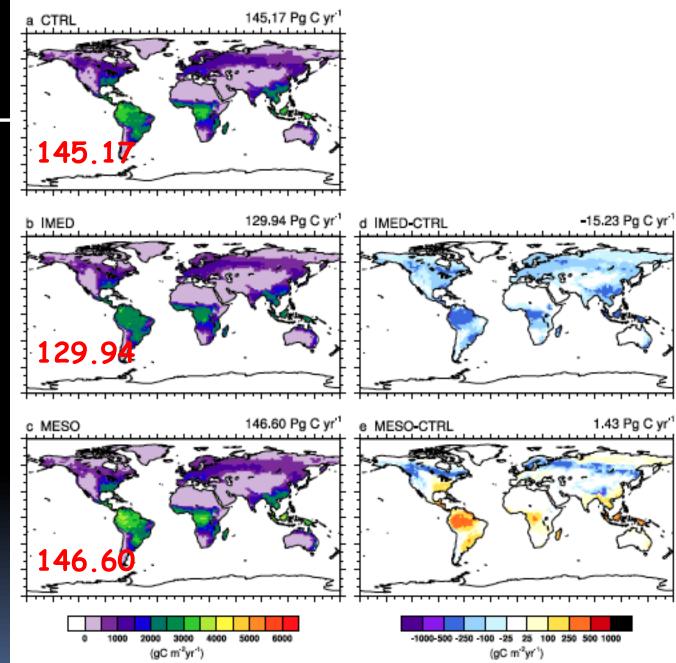
Simulation	Description
Transient CO <sub>2</sub> simulations	
CTRL	Control simulations with the default CLM4.5
IMED	Intermediate simulations that use CLM4.5 with the mesophyll conductance
	(g <sub>m</sub> ) model only, but retain the original phenomenological (g <sub>m</sub> -lacking) photosynthetic parameters
MESO	Fully updated simulations that use CLM4.5 with the $g_m$ model and the $g_m$ -including photosynthetic parameters
Constant CO <sub>2</sub> simulations	
CTRL_cCO <sub>2</sub> MESO_cCO <sub>2</sub>	Same as CTRL, but with a constant atmospheric $CO_2$ concentration (296 ppm at 1901) Same as MESO, but with a constant atmospheric $CO_2$ concentration (296 ppm at 1901)

The MESO simulations are repeated with the colimiting and monolimiting conversion functions.

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### GPP (1985-2004 mean)

GPP simulation agrees between with and without mesophyll conductance for contemporary period



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# Metrics for quantifying impact of mesophyll diffusion on global terrestrial $CO_2$ fertilization

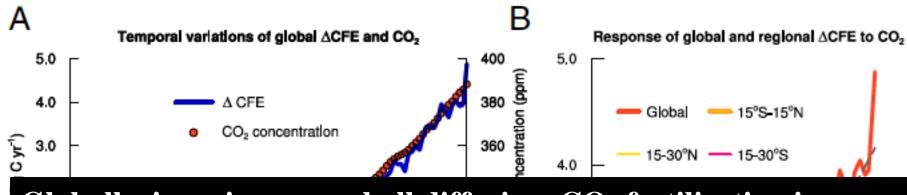
- Runs with or without mesophyll diffusion from 1901 to 2010
- Average annual GPP of 1901 to 1910 used as a reference for quantifying the CO2 fertilization effect (CFE) on GPP of the historical anthropogenic carbon emissions
- The difference in CFE (△CFE) between the runs with and without mesophyll diffusion in a given year t

$$\Delta CFE = GPP_{c}(t) - GPP_{c,ref} - \begin{bmatrix} GPP_{i}(t) - GPP_{i,ref} \end{bmatrix}$$
  
CFE with mesophyll CFE without mesophyll

 The ratio of the beta factors of the with-mesophyll to withoutmesophyll runs

$$R(t) = \frac{\beta_{c}(t)}{\beta_{i}(t)} = \frac{\left[GPP_{c}(t) - GPP_{c,ref}\right]GPP_{i,ref}}{\left[GPP_{i}(t) - GPP_{i,ref}\right]GPP_{c,ref}}$$

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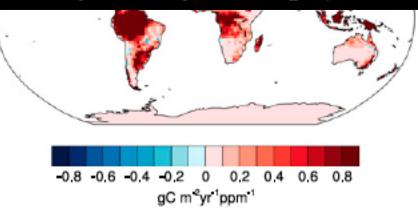


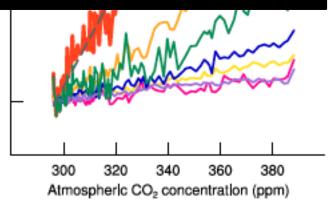
Globally, ignoring mesophyll diffusion, CO<sub>2</sub> fertilization is underestimated by 0.05PgC/yr/ppm;

**Cumulative** total of 142 PgC underestimation, equivalent to the total global fossil CO<sub>2</sub> emission from 1901 to 1978

0.0

Two primary contributors: Tropics (high productivity) and Boreal region (high mesophyll limitation)





# Metrics for quantifying impact of mesophyll diffusion on global terrestrial $CO_2$ fertilization

- Runs with or without mesophyll diffusion from 1901 to 2010
- Average annual GPP of 1901 to 1910 used as a reference for quantifying the CO2 fertilization effect (CFE) on GPP of the historical anthropogenic carbon emissions
- The difference in CFE (△CFE) between the runs with and without mesophyll diffusion in a given year t

$$\Delta CFE = GPP_{c}(t) - GPP_{c,ref} - \begin{bmatrix} GPP_{i}(t) - GPP_{i,ref} \end{bmatrix}$$
  
CFE with mesophyll CFE without mesophyll  

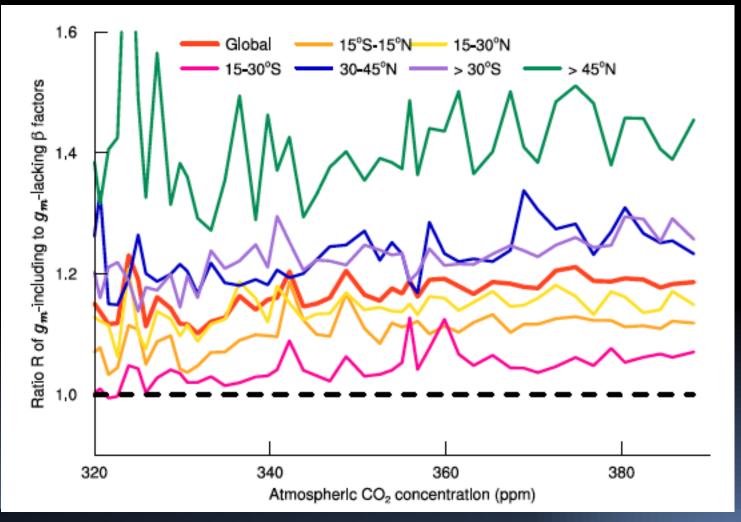
$$1057 - 915 = 142 \text{ PgC} (16\%)$$
  
142 PgC ~ 17 ppm (17% overestimation)  
Assumption: NPP = 1/2 GPP  
1/2 released CO2 stays in atmos  
1ppm = 2.123 PgC

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Mesophyll Diffusion in Carbon Cycles

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From tropics to boreal, the ratio of the beta factors increases, indicating higher sensitivity of  $CO_2$  fertilization to mesophyll diffusion in higher latitudes (high mesophyll limitation)



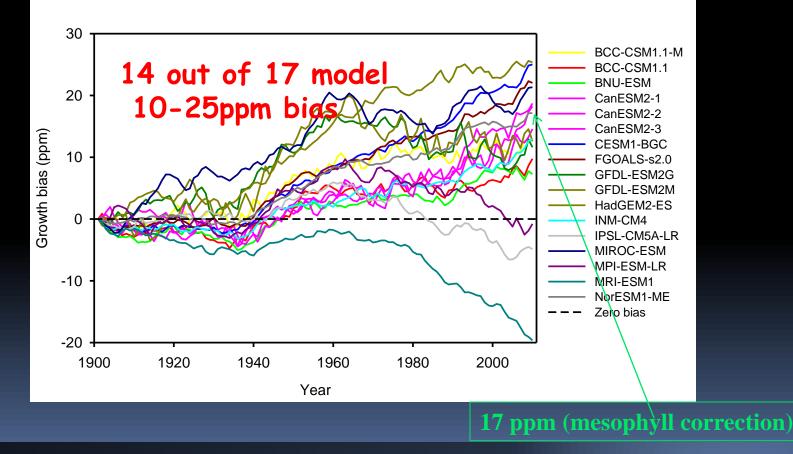
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Ignoring mesophyll diffusion, Earth System Models over-predict the growth rate of atmospheric CO2 due to fossil fuel emissions

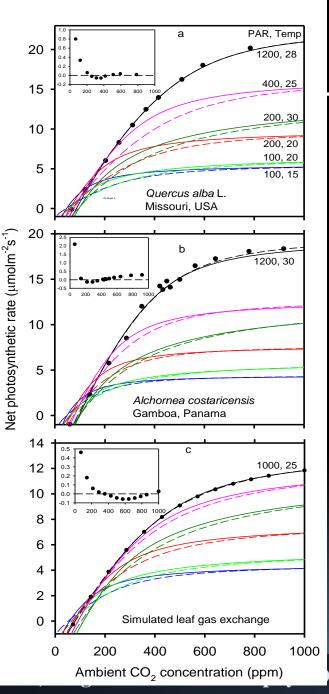
Bias of atmos CO2 growth rate in CMIP5 simulations =  $[CO_{2, \text{ model}}(t) - CO_{2, \text{ model}}(\text{ref})] - [CO_{2, \text{ obs}}(t) - CO_{2, \text{ obs}}(\text{ref})]$ 



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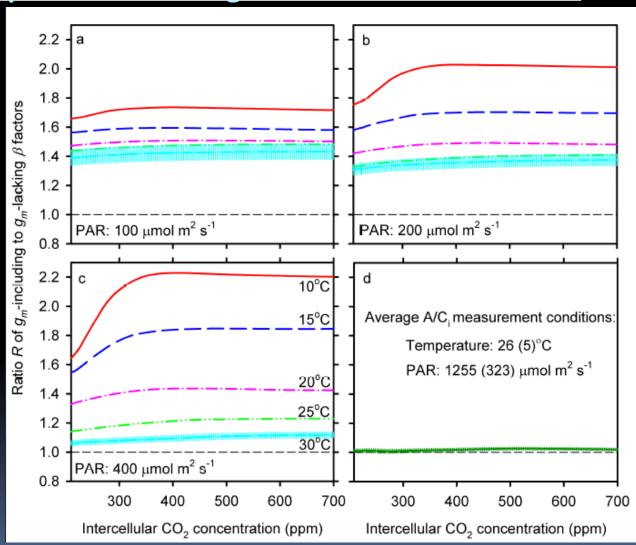


# Why lacking mesophyll diffusion underestimate the $CO_2$ fertilization effect?

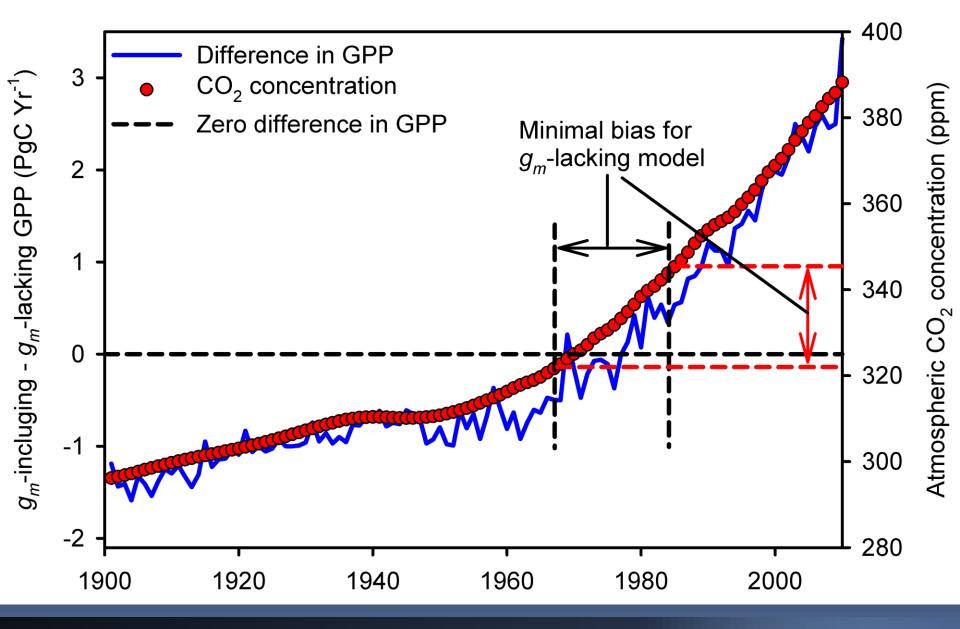
- Photosynthetic response to CO<sub>2</sub> is a saturating curve
- Larger sensitivity at lower CO<sub>2</sub> than at higher CO<sub>2</sub>
- Models without mesophyll diffusion OVERESTIMATE CO<sub>2</sub> available to Rubisco
- This model structural deficiency is tentatively compensated for when models are forced to match measurements made at narrowly controlled conditions
- The problem worsens when models run for natural environmental conditions that deviate from the original measurement conditions against which model parameters were tuned

#### iffusion in Carbon Cycles

### Leaf-scale illustration of Beta factor ratio: Deviation from measurement conditions bias photosynthesis simulation if <u>mesophyll diffusion is ignored</u>



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### Conclusions



Terrestrial biosphere may be more  $CO_2$ -limited and more responsive to the increase in atmospheric  $CO_2$  concentration than previously thought



Current global carbon cycle models may overpredict historical and future growth rates of atmospheric  $CO_2$  concentration



Mesophyll diffusion is a key process for modeling terrestrial primary production and must be represented explicitly

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