### Modeling Terrestrial Ecosystems at Different Spatial-Temporal Scales

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# **Topics Outline**

I. Overview of TRIPLEX Model Development

#### **II. Three Case Studies:**

- Modelling forest growth and carbon budgets at local scale (TRIPLEX)

- Simulating terrestrial ecosystems at regional and global scales (TRIPLEX-GHG)

**III.** Ongoing Challenges and Directions

# Three Main Approaches to Investigating Effect of Climate Change on Ecosystems



#### Long-term observation

 Experimental manipulation



Model\_simulation

(J.M. Melillo, 1999, Science, 283: 183)



### What is a Model ?



- A model is an abstraction of a real system
- We use models in two ways:
  - conceptual model
  - formal model

# Model Catalog

 Conceptual (Word or Flowcharts) Models: used to represent our concepts or knowledge and describe the interactions between the components of a system

• Mathematical (Statistical) Models: used to present the a conceptual Model or other types by using mathematical notation.

• Computer Simulation Models: Mathematical models cab be translated Into computer languages and implemented on a computer

### **Forest Simulation Models**



# Why Do We Need Models?

 Three methods to assess the effects of a changing environment on ecosystems (Botkin 1993):

(a) our knowledge of the past(b) present measurements(c) our ability to project into the future



- Our knowledge of the past and present measurements have been of limited use
- Long-term monitoring of the forest has proven difficult due to cost and long-term commitment
- Current experimental techniques are not directly applicable to complicated environmental change

### The Roles of Models

Models as research tools
 to increase our knowledge

Models as management tool
 to help to make decisions

 Models as education tools to help to understand the Earth system

# **Current Process-Based Models**

#### **Spatial Scales**

#### A. Organ (Leaf or Canopy) models

e.g. FOEST-BGC (Running and Coughlan, 1988); MAESTRO (Wang and Jarvis, 1990); BIOMASS (McMurtrie et al. 1990);

#### **B.** Individual tree ecophysiological models

e.g. ECOPHYS (Rauscher et al. 1990); TREGRO (Winstein and Yanai, 1994); TREE-BGC (Korol et al., 1994)

#### C. Community models (gap or succession models)

e.g. JABOWA (Botkin et al. 1972); FORET (Shugart and West, 1977); ZELIG (Smith and Urban, 1988); LINKAGE (Pastor and Post, 1985)

#### **D. Stand or Ecosystem models**

e.g. PnET (Aber and Federer, 1992); CENTURY (Parton et al. (1987), NDNC (Li, 1992), TRIPLEX (Peng et al, 2002)

#### E. Landscape models

e.g. FIRE-BGC (Keane et al., 1996); LANDIS (He et al. 1996) etc...

#### F. Global models

e.g. BIOME3 (Haxeltine and Prentice, 1996); IBIS (Foley et al., 1996); LPJ-DGVM (Sitch et al., 2003) etc

**Ecological Modelling and Carbon Science Laboratory (Eco-MCS** 

Laboratoire de modélisation écologique et de science du carbone (Eco-MSC)

(www.crc.uqam.ca)

### Eco-MCS Lab. Objective



Develop state-of-the-art computer simulation models across different scales and use them to assess the impacts of past and future climate change and associated ecosystem disturbances on terrestrial and aquatic ecosystems across Canada, China and Globe



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# TRIPLEX Model Development History (10 years)

- 2000- 2002: TRIPLEX 1.0 (OFRI, Sault Ste Marie, ON, Canada)
- 2003-2005: TRIPLEX 1.0 Testing and application at stand and landscape Levels (SD, USA; UQAM, Montreal)
- **2004-2010:** Application of TRIPLEX1.0 in China (Beijing U, Zhejiang U and Central-South U of Forestry & Tech.)
- •2006-2008: TRIPLEX-Flux, TRIPLEX-Fire, TRIPLEX-DOC (UQAM)
- •2008-present: TRIPLEX-Management (UQAM); TRIPLEX-Aquatic (UQAM and China); TRIPLEX-DGVM (UQAM and China)

### TRIPLEX Model Development Publications (2002-2012) (www.crc.uqam.ca)

#### TRIPLEX1.0 Model

- Peng et al, (2002), Ecol. Model ; Liu et al. (2002), CEA

#### •TRIPLEX Application in Canada:

- Zhou et al (2004), EM&S; Zhou et al (2005), CJFR; Zhou et al. (2006), MASGC

### **TRIPLEX Application in China**

- Zhang et al. (2008), EM; Peng et al. (2009), GPC; Zhao et al. EM (2012)

#### • New TRIPLEX-Flux, TRIPLEX-Fire, TRIPLEX-DOC

- Zhou et al (2008), EM; Sun et al. (2008), EM; Two MS (in preparation)

#### •TRIPLEX-Management, TRIPLEX-Aquatic, TRIPLEX-GHG

- Wang et al (2010, 2012); Wu et al.(submitted); Zhu et al. (in preparation)

# **TRIPLEX:** A generic hybrid model for predicting forest growth and carbon and nitrogen dynamics

(Peng et al. 2002, Ecol. Model)

Developed based on well-established models:

3-PG (Landsberg and Waring, 1997) TREEDYN3.0 (Bossel, 1996) CENTURY4.0 (Parton et al., 1987, 1993)

- Bridges the gap between forest growth and yield and process-based C balance models
- Can be used for:
  - 1) Making forest management decisions (e.g., G&Y prediction)
  - 2) Quantifying forest carbon budgets
  - 3) Assessing the effects of climate change on forest ecosystems

### **Key Features of TRIPLEX1.0:**

• Driving variables (main inputs):

Monthly climate data; tree & stand variables, LAI, soil texture, geo-location

• Mass balances:

C, N, and water pools and fluxes fully balanced

• Time step:

Monthly C flux and allocation calculation; annual tree growth, C, N, and water budget

• Outputs:

H, DBH, BA, volume, NPP, biomass, soil C, N, and water dynamics

• Modelling strategy:

**OOP** (objective-oriented programming - C++) and model reuse approaches



Triplex v 2.0	
<u>File Window Model Iools Help</u>	
Triplex v1.0	Model Builder
100 100 100 100 100 100 100 100	Components forming a model         PAR         DHV         Climate       GPP         Partitioner         Soil Water       Soil C, N         Litterfall         Accept this model
Excel Application Support	Model Parameters
Triplex uses Excel97 for multiple sites simulation. If you have only one site to simulate, you can choose not to use Excel. Climate File D:\jinxun1\Tri_T2\Test_ClimateData.xls	Model component :       Century_SoilCNOn         L_Emission=1
Site file D:\jjinxun1\Tri_T2\Test_SiteData.xls	L Surface microbe=50
Result File D\jinxun1\Tri_T2\Test_SiteData_Result_5-	Color: Variable: Scale: Unit:
OK Result Interval : 10 No Excel	Red     L_P     0.05     stem       Yellow     AnnualGpp     10     t/ha/year       Blue     DBH     500     meter
	White AnnualNop 10 t/ba/year
	Green MineralN V 4000 t/ba
TRIPLEX 1.0 User Interface	

### **Challenge: Validation**

Validation is testing a model to see how well it predicts. (How well does the model capture the structure, controls, and dynamics of a real forest ecosystem).

First questions is: what variable do we want to validate (test)?

The second question is finding adequate data.

### **Data for Validating Ecosystem Models**

- Greenhouse or experimental data
- Tree growth plots (PSP, TSP)
- Forest inventory
- •Flux tower (CO<sub>2</sub>, NPP, NEP etc..)
- Remote Sensing (NDVI-NPP, MODIS etc..)
- Paleoecological data (pollen, tree-ring)

Click here to learn about tree rings & to try crossdating for yourself.









**BO: Boreal; CT: Cool Temperate; MT: Moderate Temperate; SA: Subartic** 

### Calibration and Validation for TRIPLEX Model

We have 6 consecutive measurements (very 5 yr) for DBH, H, tree density (1952-1982)

Use first measurements (1952) to calibrate the TRIPLEX model

• Use the other 5 measurements to validate (1957 - 1982)

### **Comparison of Simulations and Observations**

(solid diagonal is the 1:1 line; N=60)



Comparison of Averaged Simulations and Observations -*Stem Density* 



Comparison of Averaged Simulations and Observations -Aboveground Biomass (Hegyi, 1972)



# Modeling Forest Growth and Carbon Dynamics at Landscape level in Lake Abitibi Model Forest



(May 12, 2002)



(Zhou et al, 2007)



# Method

### **Simulation Model**

### **Outputs**



# **Model inputs**

	<ul> <li>LAMF Local data (stands and spatial data)</li> </ul>
Forest	
Soil	<ul> <li>Ontario Land Inventory Prime land Information System (OLIPIS)</li> <li>A soil profile and organic carbon data base for Canadian forest</li> </ul>
Climate	<ul> <li>Database from Environment Canada</li> <li>Canadian Centre for Climate Modeling (CCCMa database)</li> </ul>

### **Model validation**





32 black spruce,9 jack pine,8 trembling aspenplots(measured in 1995)

(Zhou et al., 2005)

#### **TRIPLEX vs. Forest Inventory**

#### **NPP Spatial Distribution at Landscape Level**



(Zhou et al, 2005)

(Liu et al, 2002)

Fig. 4 The comparison between NPP (t C ha-1 yr-1) simulations at landscape (a) and remote sensing (b) levels for the LAMF in 1995. (a) was based on the TRIPLEX model simulation for 1995 (averaged 3.28 tC ha-1 yr-1, SD=0.79), and (b) was converted using spatial data from Liu et al. (2002) for 1994 (averaged 3.08 tC ha-1 yr-1, SD=1.15). The grid size *is* 3x3 km.

Kappa Statistic (k) = 0.55

Good agreement if 0.55<K<0.7

### Total Height (m)



### DBH (cm)



2000



Simulated Biomass (t ha<sup>-1</sup>) in 2000

Simulated NPP (tC ha<sup>-1</sup>yr<sup>-1</sup>) in 2000



### Simulated Soil carbon (tC ha<sup>-1</sup>) in 2000

### **Soil texture**



C budget of LAMF forest ecosystem in 2000:

Net carbon balance (NCB) = 2.0 Mt C

(Zhou et al., 2007)

### **Case Study 3**

Global and Planetary Change 66 (2009) 179-194



Quantifying the response of forest carbon balance to future climate change in Northeastern China: Model validation and prediction

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June, 2004

#### 中国科学院长白山麦林生态系统定位站 The Research Station of Changbail Mountain 1号 Economy Chin Changbail Mountain 1号 Economy Chin Changbail Sciences

A S . Propagation S.



### **Chinese Forest Carbon**

### **Chinese Soil Carbon**



Carbon storage increased significantly after the late 1970s from 4.38 to 4.75 pg of carbon by 1998, for a mean accumulation rate of 0.021 pg of carbon per year.

> Changes in Forest Biomass Carbon Storage in China Between 1949 and 1998 Jingyun Fang,<sup>1\*</sup> Anping Chen,<sup>1</sup> Changhui Peng,<sup>2</sup> Shuqing Zhao,<sup>1</sup> and Longjun Ci<sup>3</sup>

> > 22 June 2001, Volume 292, pp. 2320-2322



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> VOLUME 9 NUMBER 3 MARCH 2003

A loss of 7.1 pg soil C due to increasing human activities (land use)



#### (Wu et al., 2003)

Land-use change and soil organic carbon storage in China
 Cross-biome comparison of light-use efficiency for GPP

Elevated CO<sub>2</sub>, nitrogen and fungal endophyte infection

Publishing • Climate change and fitness of migratory birds

Blackwell
# **Objectives**

1) Validate the TRIPLEX1.0 model using a comprehensive ground observations and measurements;

2) Simulate the temporal and spatial response of NPP and carbon balance under projected future climate change and increasing CO2 scenarios



Comparison of simulated forest NPP against 133 observed forest NPP in northeastern China. The observed forest NPP data sets are obtained from the most comprehensive database complied by the PhD dissertation of Luo (1999) and Ni et al. (2001).



Comparison between simulated and observed soil carbon for four major forest types. (a) refers to averaged values of model simulations in this study. (b) and (c) represent average values measured by Zhu et al. (2005) and Yang and Li (2003), respectively. The vertical line represents standard error (*SE*) for b.

### **Climate Change Scenarios**

CGCM3.1 outputs for the period from 2001 to 2100, under three scenarios (IPCC, 2005):

(a) A2, Temperature and CO2 increase 4 °C and 350-850 ppm;

(b) A1, Temperature and CO2 increase 3 °C and 350-700 ppm;

(c) B1, Temperature and CO2 increase 2 °C and 350-550 ppm;



Relative changes of NPP (t C ha<sup>-1</sup>yr<sup>-1</sup>) in 2030s (averaged over 2030-2040) and 2090s (averaged over 2090-2100) under different three scenarios (A1, A2, B1) compared with baseline (1999).

(Peng et al, GPC, 2009)



(b) Climate change and increasing CO<sub>2</sub>



#### (a) Climate change along (CC)

#### (b) CC + CO2 fertilization effect





Simulated temporal dynamics of total biomass (left) (Pg C=  $10^{15}$  g C) and soil carbon stock (right) (Pg C) under 3 different climate change scenarios with two experiments

### **Summary**

The results show that the simulated forest yield, NPP, total biomass and soil carbon are consistent with observed data across northeastern China, suggesting that the TRIPLEX1.0 model is able to simulate forest growth and carbon dynamics for boreal and temperate forest ecosystems at regional scales.

Climate change would increase forest NPP and biomass carbon, but decrease overall soil carbon under all three climate change scenarios. Combined effects of climate change and increased atmospheric  $CO_2$  would result in increased NPP and carbon within vegetation and soil for both the short-term (30 to 40 years) and long-term (90 to 100 years).

The simulated effect of  $CO_2$  fertilization significantly offset the soil carbon loss due to climate change alone.

Overall, the forest ecosystems of northeastern China are very sensitive to changes in future climate change and increasing  $CO_2$  in the atmosphere.

# **New TRIPLEX-Flux Model Development**

#### **TRIPLEX1.0 (big leaf, monthly)**

#### **TRIPLEX-Flux (two leaves, daily)**





# Model Testing for 2 Flux tower sites



## (Fluxnet-Canada)

## **Boreal Mixedwood Site (Ontario)**





#### (Sun et al., 2008)

## **Model Validation – OBS Flux Tower**



#### **Daily Simulation using TRIPLEX-flux**

(Zhou et al, 2008)

# **Simulation Uncertainty**



Source: Friedlingstein et al., 2006

Parameters estimation and net ecosystem productivity prediction through model-data fusion approach for seven forest flux sites in North America (Zhou et al., submitted)

### Objectives

- to estimate some key parameters using data assimilation approach;
- to test TRIPLEX-Flux model simulations against flux tower measurements;
- to understand the uncertainty of estimating carbon sequestration due to model parameters variation for different forests

# Sources of Uncertainty

- basic model structure
- initial conditions (e.g.vegetation types, especially mixed)
- model parameters
- data input
- representation of natural and anthropogenic disturbance (e.g. regeneration after fire and cutting)
- scaling exercises
- knowledge limitation for ecosystem process

# Flux Tower Sites



Davis et al, 2008, AGU

# model-data assimilation



Optimization (MCMC)

MCMC: Markov chain Monte Carlo

## **Selected Parameters**

- $V_{max}$  : maximum carboxylation rate at 25° C in the photosynthetic carbon cycle in leaf
- $J_{max}$  : light-saturated rate of electron transport in the photosynthetic carbon cycle in leaf
- m : coefficient of stomatal conductance
- $R_{10}$ : the reference respiration rate at 10 °C

## Maximum likelihood estimation



# **Model Parameter Optimization (MCMC)**



(Sun et al, in preparation)

## **NEP** simulation





EC: eddy covariance, BO: before optimization, AO: after optimization ENB = Evergreen needle-leaf boreal forest, ENT = evergreen needle-leaf temperate forest, DB = deciduous broad-leaf forest

for 2006

350













for 2006

The North American Carbon Program (NACP) Multi-Scale Synthesis and Terrestrial Model Intercomparison (MsTMIP) Project (http://nacp.ornl.gov/MsTMIP.shtml)

The overall goal of the MsTMIP is to

provide feedback to the terrestrial biospheric modeling community to improve the diagnosis and attribution of carbon sources and sinks across regional and global scales.



# **MsTMIP Participants**

- Over 19 different institutions
- Over 20 different models
  - $\circ$   $\sim 6$  dynamic vegetation models
  - $\circ$  ~9 models have prognostic fire
  - ~2 data assimilation models
- Most models participated in NACP site and/or regional interim synthesis activities

	VEGAS	DLEM	CLM-VIC	ISAM					
	SIPNET	PRIPLEX-GHG	LPJ-wsl	Ecosys					
	MC1	CLASS-CTEM-N+	GEMS	ORCHIDEE					
	SiB	SiB-CASA	TEM	CLM-CN					
Biome-BGC		IRC	ED	GTEC					
	I multiple modele out of IDI								

+ multiple models out of JPL

MsTMIP **workshop 1** was held at NASA Ames Research Center on October 13<sup>th</sup> and 14<sup>th</sup>, 2011.

Next MsTMIP **workshop** will be held the beginning of March, 2012 (location TBD).

### Terrestrial biospheric models participating in the MsTMIP activity

Model Name	Affiliation (Team Contact)	Model Name	Affiliation (Team Contact)
	Pacific NW Research Station		NASA Jet Propulsion Lab
BIOMAP (John Kim)		JULES	(Joshua Fisher)
	NASA Ames		Laboratoire des Sciences du Climat et l'Environnement (LSCE),
Biome-BGC	(Weile Wang)	LPJ	France (Ben Poulter)
	NASA Jet Propulsion Lab		Oregon State University
CABLE	(Joshua Fisher)	MC1	(Dominique Bachelet)
	McMaster University		NASA Jet Propulsion Lab
CLASS-CTEM-N+	(Altaf Arain)	ORCHIDEE	(Joshua Fisher)
	Oak Ridge National Lab		Laboratoire des Sciences du Climat et l'Environnement (LSCE),
CLM	(Dan Hayes)	ORCHIDEE	France (Shushi Peng)
			Colorado State University
CLM4-VIC	Pacific Northwest National Lab (Maoyi Huang)	SiB3.1	(Ian Baker)
	Auburn University		NASA Jet Propulsion Lab
DLEM	(Hanqin Tian)	SiB3	(Joshua Fisher)
	University of Maryland		National Snow and Ice Data Center
ED	(George Hurtt)	SiBCASA	(Kevin Schaefer)
	USGS		Applied GeoSolutions, LLC
GEMS	(Shuguang liu)	SIPNET	(Rob Braswell)
	Oak Ridge National Lab		Oak Ridge National Lab
GTEC	(Dan Riccuito)	ТЕМ	(Dan Hayes)
	NASA Jet Propulsion Lab		University of Quebec at Montreal
Hyland	(Joshua Fisher)	TRIPLEX-GHG	(Chanqhui Peng)
	Colorado State University		University of Maryland
IRC/DayCent5	(Tom Hilinski)	VEGAS	(Ning Zeng)

# Ten Simulations (1801-2010)

Order	Domain	Code	Climate	LULUC	Atm. CO <sub>2</sub>	Nitrogen
1	Global	RG1	Constant	Constant	Constant	Constant
2		SG1				
3		SG2	CRU+NCEP	Hurtt et al.		
4		SG3			Observed	
5		BG1				Observed
6	North Amer.	RR1	Constant	Constant	Constant	
7		SR1		Constant	Constant	Constant
8		SR2			Observed	Constant
9		SR3	NARR	Hurtt et al.		
10		BR1				Observed

Framework of integrating trace greenhouse gas emission processes into

**TRIPLEX- GHG (DGVM)** 

(under development)

Theta\_s,min

Theta\_u\_s

unsaturated

saturated



Catolelm layer

ф

Low Boundary

Organic Carbon



(Zhu et al., in prepa.)

#### mean1990-2005 gC/m2/year



(Peng et al., in prepa.)

#### 17 -CA CA-CH4 (Tg C/year) Year

# Mean Annual GPP (1980-2010)



# Mean Annaul NPP (1980-2010)



# Mean Annual NEP (1980-2010)



# Soil Carbon



(Zhu et al., in prepa.)

## **Challenges for TRIPLEX Development**

- Continued testing of the model's ability to belowground biomass, soil C, N and water (BOREAS sites as well as Canada-Fluxnet)
- Developing new submodels (TRIPLEX-Fire, TRIPLEX-DOC, TRIPLEX-management) to include the effects of ecosystem disturbances (fire, harvesting, insects, disease), land use, and forest management planning
- Linking terrestrial ecosystem with aquatic ecosystem : TRIPLEX-Aquatic
- Integrating trace greenhouse gas emission processes into TRIPLEX model (TRIPLEX-GHG, TRIPLEX-DGVM)

#### **Uncertainty in Ecosystem Carbon Budget**


#### Accidental mortality after disturbances





### Disturbance

### Disturbance is a cause of carbon loss from many ecosystems

Fire and harvest of plants or peat can be the dominant Avenues of carbon losses from ecosystems:

**Carbon losses during fires in the Canadian boreal forests** 

= 10 to 30% of average NPP (Harden et al., 2000, GCB)







#### **Ongoing: TRIPLEX-Fire Model**

DOC is still missing in current ecosystem carbon budget

### DOC is poorly represented in most terrestrial carbon models

Within forested ecosystem, DOC leaching from the forest floor and organic soil horizons ranges from 10 to 85 g m<sup>-2</sup> yr<sup>-1</sup> (Neff and Asner, 2000)





Modeling and Coupling Terrestrial and Aquatic Ecosystems: TRIPLEX-Aquatic



### Lake Mary

Condition: <u>No perturbed</u>

Lake: 0.58 km<sup>2</sup> Watershed:1.22 km<sup>2</sup>









#### **TRIPLEX-Aquatic Simulations** (Wu et al., submitted)



## **Challenges for Science**

- Weaknesses in Scientific Understanding:
  - Allocation of C in plant tissues
  - Nutrient feedback
  - CO<sub>2</sub> fertilization at ecosystem scale is it real? important?
  - Projecting changes in disturbance regimes (fire, insect, harvesting, ice damage...)
  - Peatland and wetland carbon dynamics
  - Other GHG (CH4 and N2O) etc....



Proposed Sites, Fluxnet-Canada



#### **Take – Home Messages:**

"To keep the model as simple as possible, as complex as necessary"

> " I hear and I forget; I see and I remember; I do and I understand ! "

# **Thanks!**

Open for Questions and Collaboration (www.crc.uqam.ca)