

# Modeling Land Competition

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AIM International Workshop

Tsukuba, Japan  
19-21 February 2007

# Objectives

- ▶ Extend partial equilibrium land use framework to general equilibrium
  - Forestry identified as a priority model development item in review of PNNL general equilibrium framework (Second Generation Model) by U.S. EPA Science Advisory Board
  - What is the right level of abstraction for a recursive CGE model?
    - Forest dynamics
    - Number of crops, animal products, forest products
    - Geographic detail
- ▶ Improve ability to simulate impact of carbon price on land use
  - Biofuel incentive
  - Forest management (increased tree rotation age)
  - Value carbon in unmanaged land

# Overview

- ▶ Modeling Approaches
  - Forestry optimization
  - Partial and general equilibrium economics
- ▶ PNNL Agriculture and Land Use Model (AgLU)
  - Brief history
  - Land allocation mechanism
- ▶ Disaggregation of US region into land subregions
- ▶ Forest dynamics
  - Determination of optimal tree rotation age
  - Carbon price and rotation age
- ▶ Steady-state simulation
- ▶ What Next?

# Modeling Approaches

- ▶ Intertemporal Optimization
  - Typical for sector-specific models (e.g. forestry)
- ▶ Intertemporal Equilibrium (perfect foresight)
  - Efficiency conditions (first order necessary conditions) from intertemporal optimization model become system equations
  - Allows integration with other types of economic systems (such as agriculture)
- ▶ Recursive Equilibrium
  - Absence of look-ahead capability makes it difficult to model forestry
- ▶ Steady-State Equilibrium
  - Exploratory tool
  - Steady-state modeling of forestry may be able to inform recursive models

## Relationship to Specialized Forestry Models

	partial equilibrium	general equilibrium
intertemporal optimization	TSM, FASOM	Ramsey growth model
intertemporal equilibrium	AgLU 2	intertemporal CGE
recursive equilibrium		recursive CGE
steady-state equilibrium		AgLU 2x

# Brief History of AgLU

- ▶ First version completed in 1996
- ▶ Design
  - Top-down
  - Partial equilibrium
  - Can be run stand-alone or as part of MiniCAM
- ▶ Studies
  - Role of biomass in carbon policy
  - Impact of ENSO on North America
  - U.S. climate impacts

# Methodology Highlights

- ▶ 15-year Time Steps from 1990 through 2095
- ▶ Land Allocation
  - Land owners compare economic returns across crops, biomass, pasture, and future trees
  - Underlying probability distribution of yields per hectare
- ▶ Forest Dynamics
  - Trees in AgLU grow for 45 years
  - Two forest markets (current and future) needed for model stability

# Products in AgLU

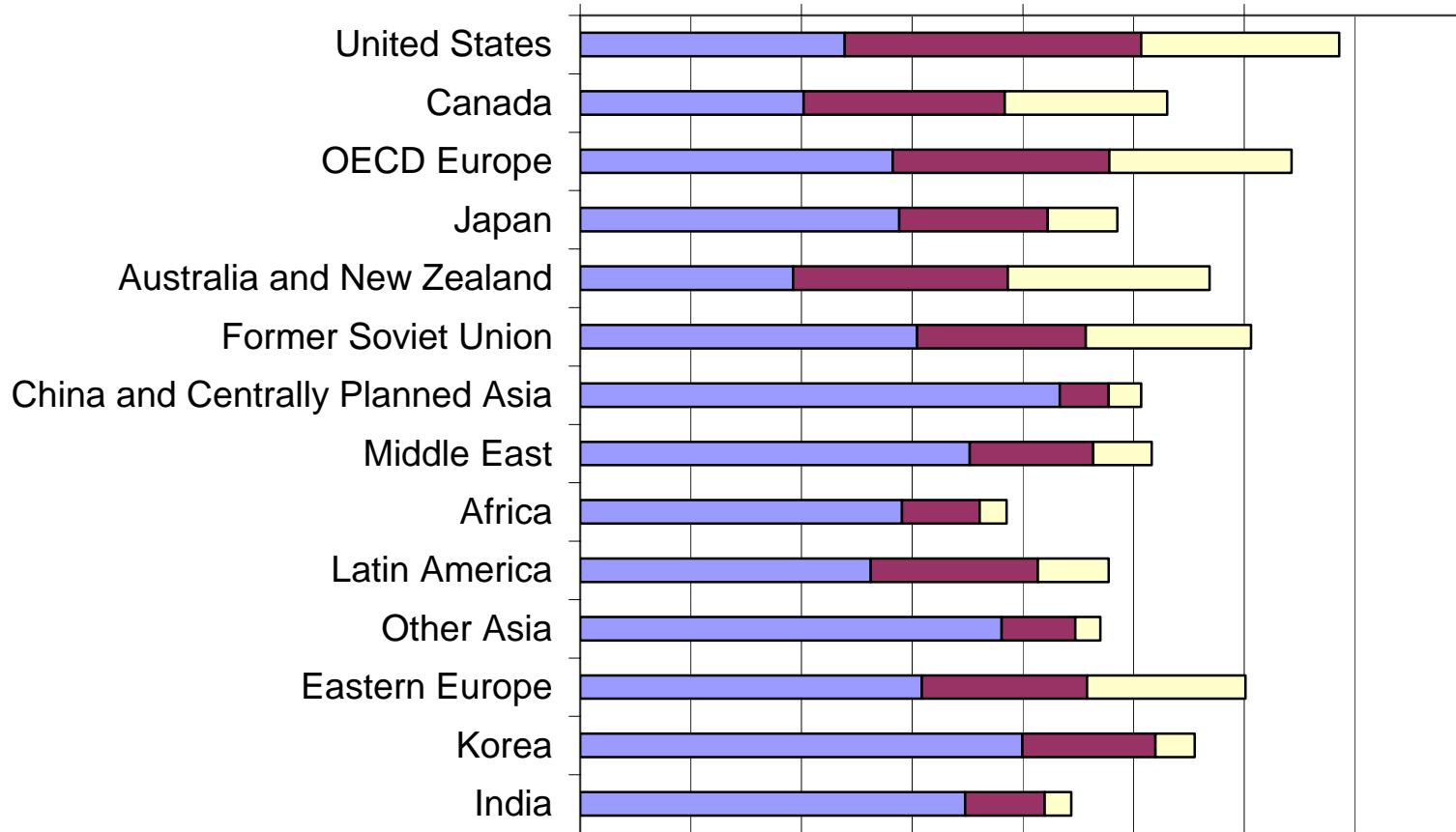
- ▶ Crops (calories)
  - Rice and Wheat
  - Coarse Grains
  - Oil Crops
  - Other Crops
- ▶ Processed Crops (calories)
  - Vegetable Oils
  - Sweeteners and Alcoholic Beverages
- ▶ Animal Products (calories)
  - Beef and other Ruminant Livestock
  - Pork and Poultry
- ▶ Commercial Biomass (calories or metric tons)
- ▶ Forest Products (cubic meters)



# Food Consumption by AgLU Region

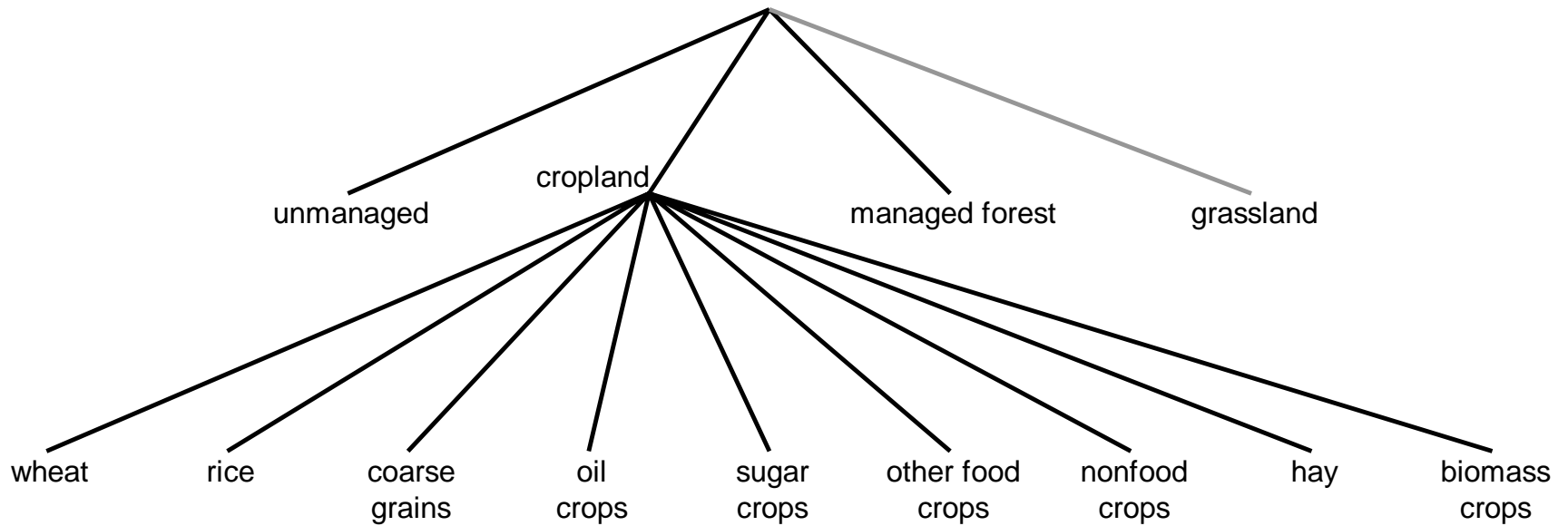
kcal per person per day

0 1,000 2,000 3,000 4,000



■ Crops 
 ■ Processed Crops 
 ■ Animal Products

# Land Allocation



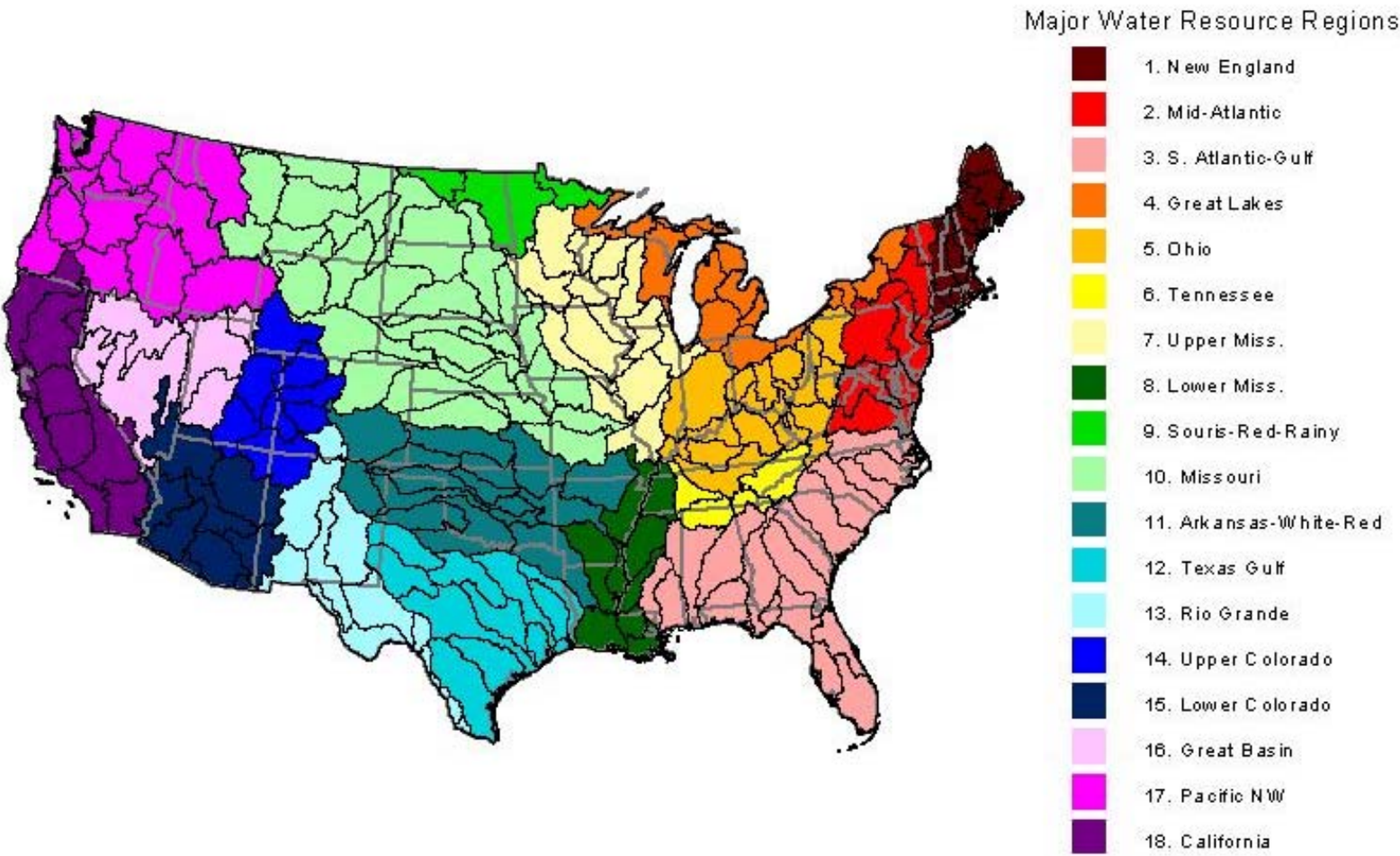
# Agriculture-Forestry Data

- ▶ Agriculture-Forestry Data
  - Food balances
  - Land use data
  - Forest and agricultural production
- ▶ United Nations Food and Agriculture Organization (FAO) is the primary source of data
- ▶ Global Trade Analysis Project (GTAP) provides land use and agricultural production data for land classes within a country

# US Land Classes

- ▶ Why Disaggregate?
  - Capture geographical heterogeneity
  - Terrestrial mitigation opportunities vary by land class
  - Climate impacts will vary by land class
- ▶ Hydrologic Unit Areas (HUAs)
  - 18 two-digit water basins in US
  - Fixed location
  - Useful for climate impact studies
  - Link to water supply will be important for future work on water and potential for biofuels
- ▶ Base-Year Calibration
  - No unique way to calibrate base year (calibration is something of an art)
  - Not easy to calibrate all of the following: land area by product and land class, output by product and land class, prices, costs of production
  - Exact calibration doesn't tell you where your model structure can be improved

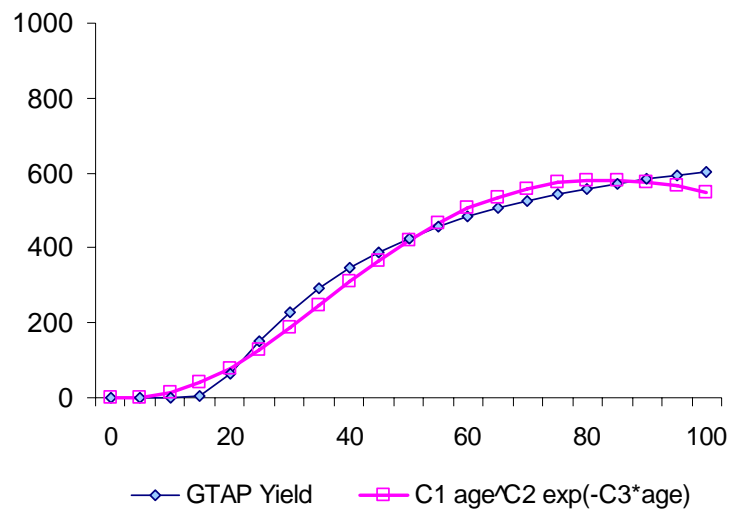
# Major Water Resource Regions



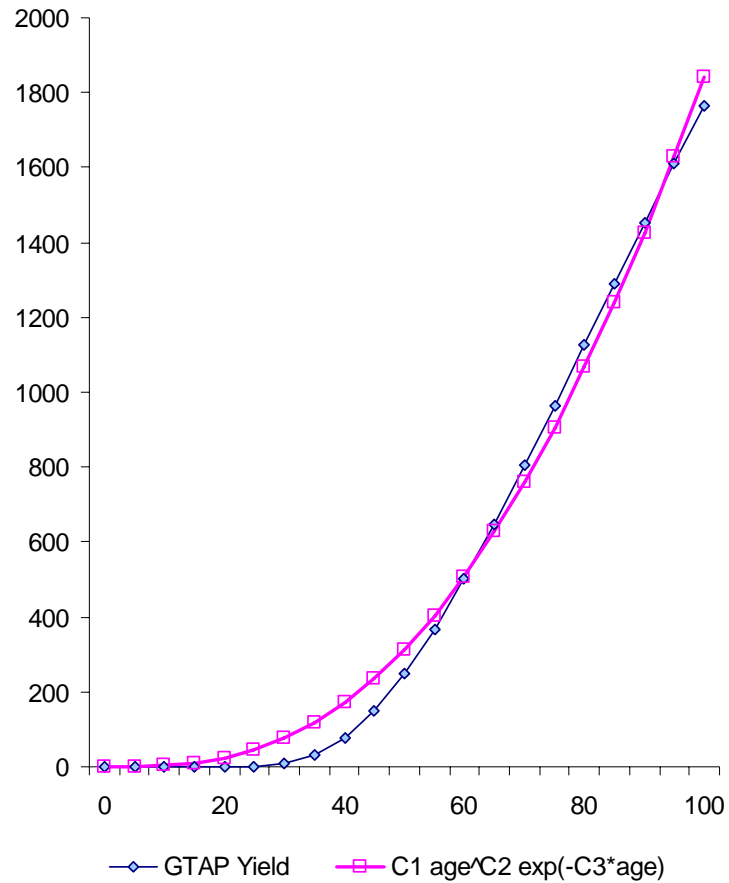
# Forest Dynamics

- ▶ Tree growth curves vary across United States
- ▶ Calibration of growth curve to data provided through GTAP
- ▶ Response of forest production to carbon incentive
  - Optimal tree rotation age increases with carbon price
  - Faustmann equation (modified by carbon incentive) is an extra system equation paired with unknown rotation age
  - Modified Faustmann equation includes term that integrates carbon stock or increment of carbon sequestered over tree growth curve
  - Can calculate carbon incentive either as a rental paid for carbon storage or as full payment for increment sequestered
  - Computational burden can be reduced by selecting functional form for tree growth curve that has closed-form integral

## Tree growth curve for southeastern pine plantations (yield in cubic meters as a function of tree age)

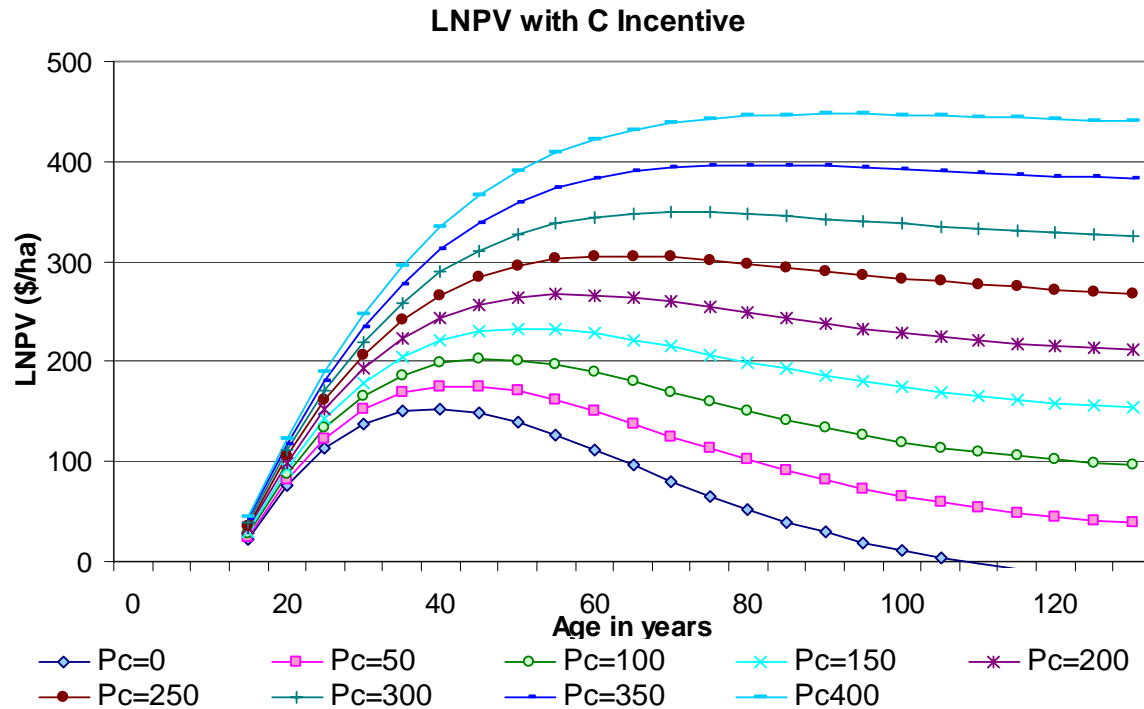


## Tree growth curve for Pacific Northwest (yield in cubic meters as a function of tree age)



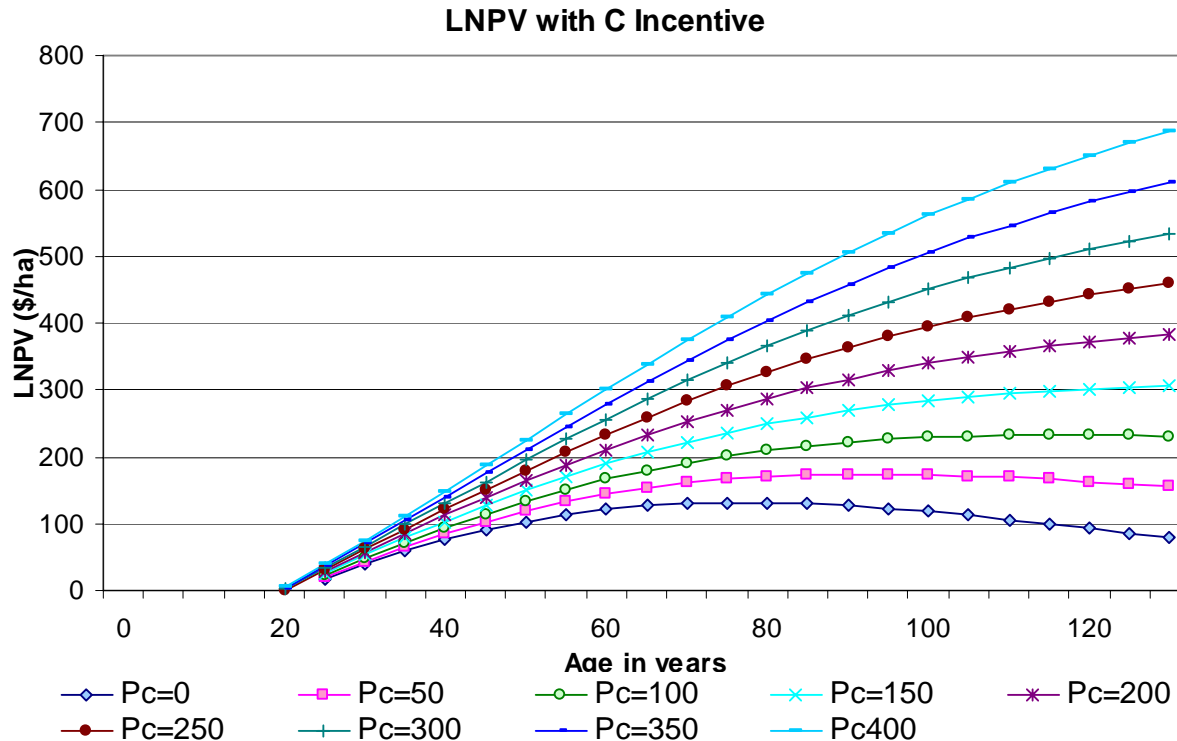


## Levelized net present value per hectare at various carbon prices: southern pine plantation trees



Assumptions:  $p_t = \$49$  per cubic meter,  $c_g = \$1,000$  per hectare,  $k = 0.2$  metric tons carbon per cubic meter of wood,  $r = 3\%$ , all stored carbon is released to the atmosphere at harvest

## Levelized net present value per hectare at various carbon prices: Pacific Northwest trees



Assumptions:  $p_t = \$49$  per cubic meter,  $c_g = \$750$  per hectare,  $k = 0.2$  metric tons carbon per cubic meter of wood,  $r = 3\%$ , all stored carbon is released to the atmosphere at harvest

# Steady-State Land Use Simulation

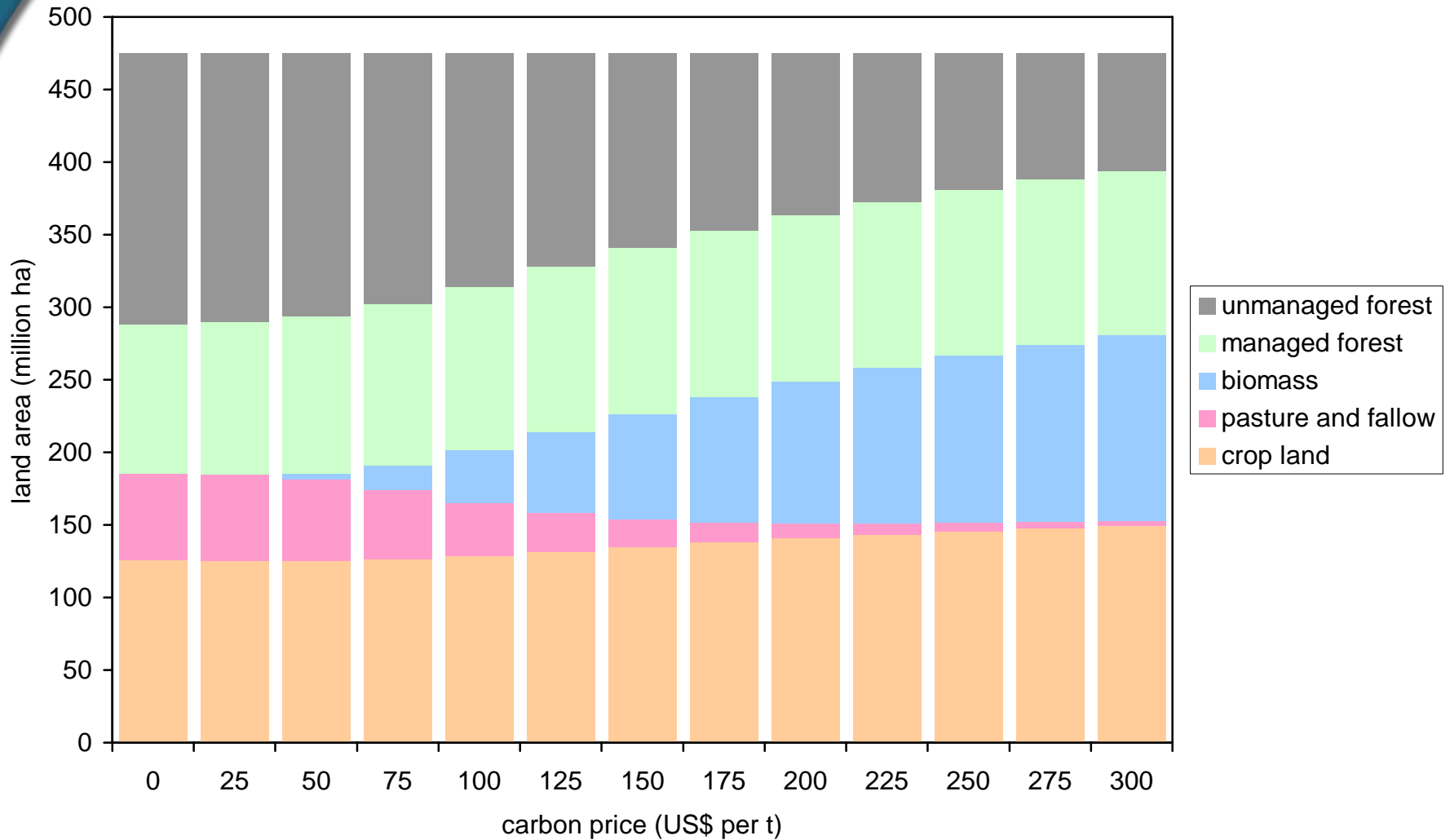
## ▶ United States

- Land use as function of carbon price (up to US\$ 300 per ton of carbon)
- All other drivers held constant: population growth, agricultural productivity, income

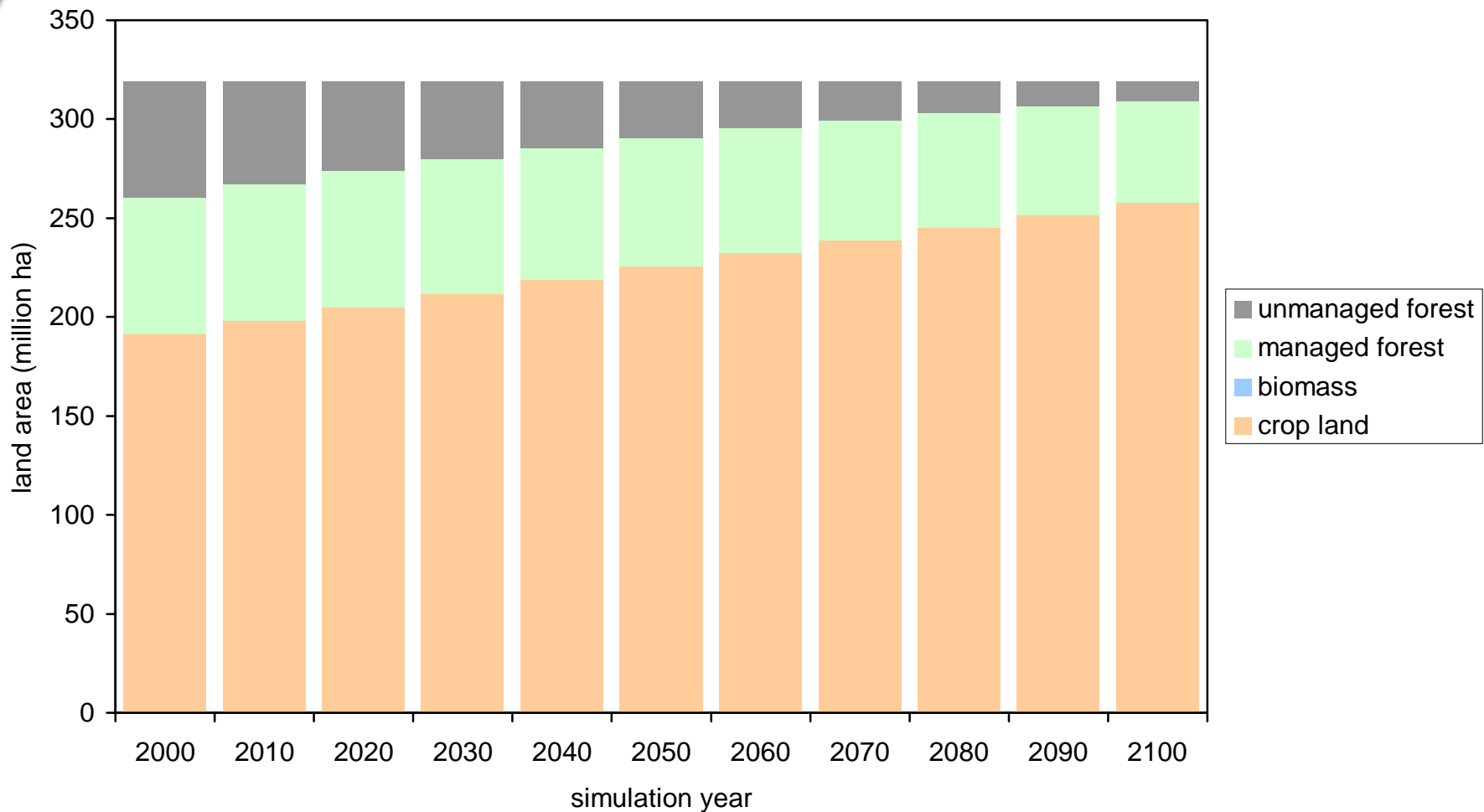
## ▶ India

- Land use over time is sensitive to difference in growth rates between agricultural productivity and population growth
- Three baselines
  - Agricultural productivity < population growth
  - Agricultural productivity = population growth
  - Agricultural productivity > population growth

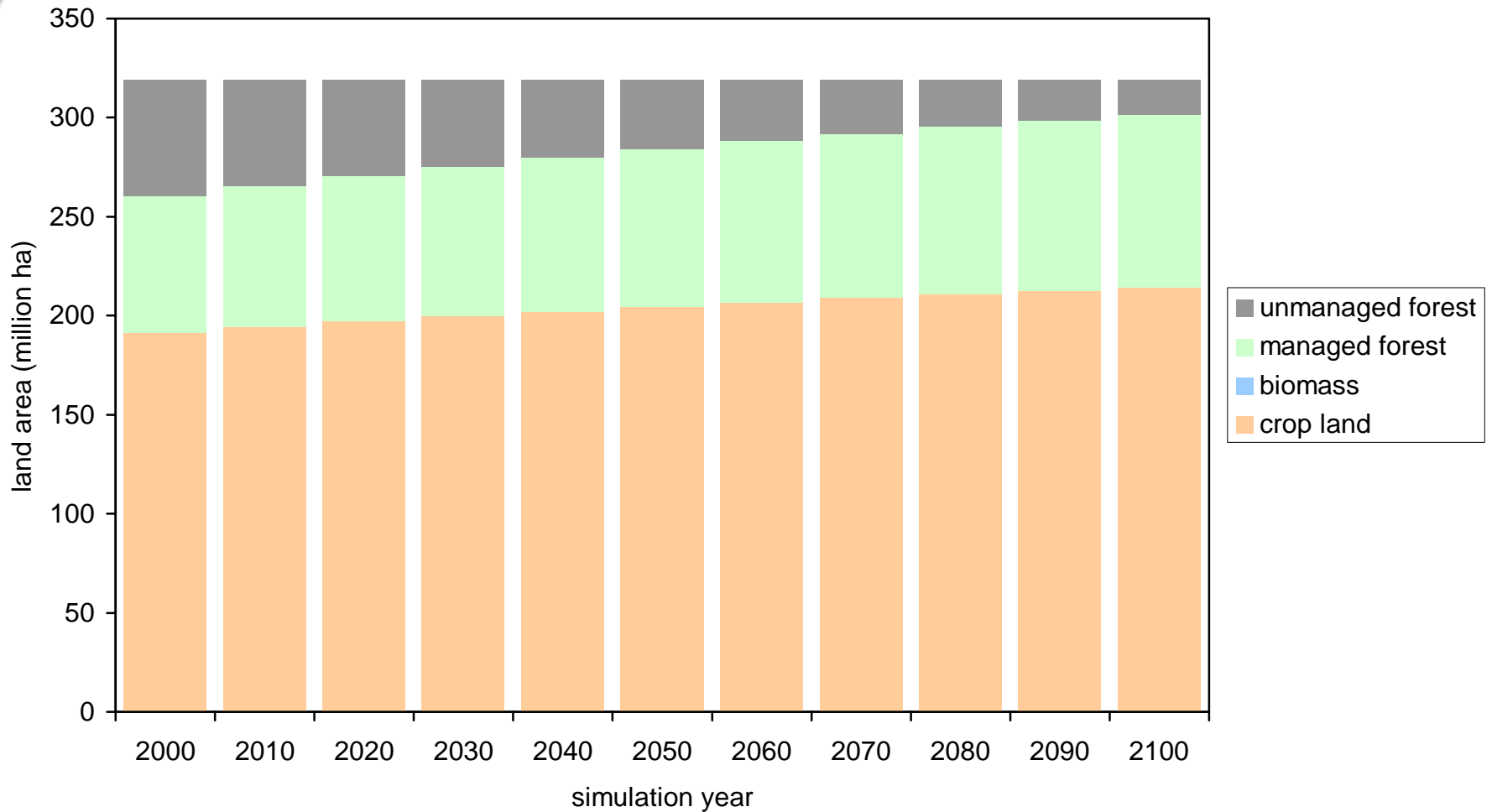
# US Land Simulation with Varying Carbon Prices



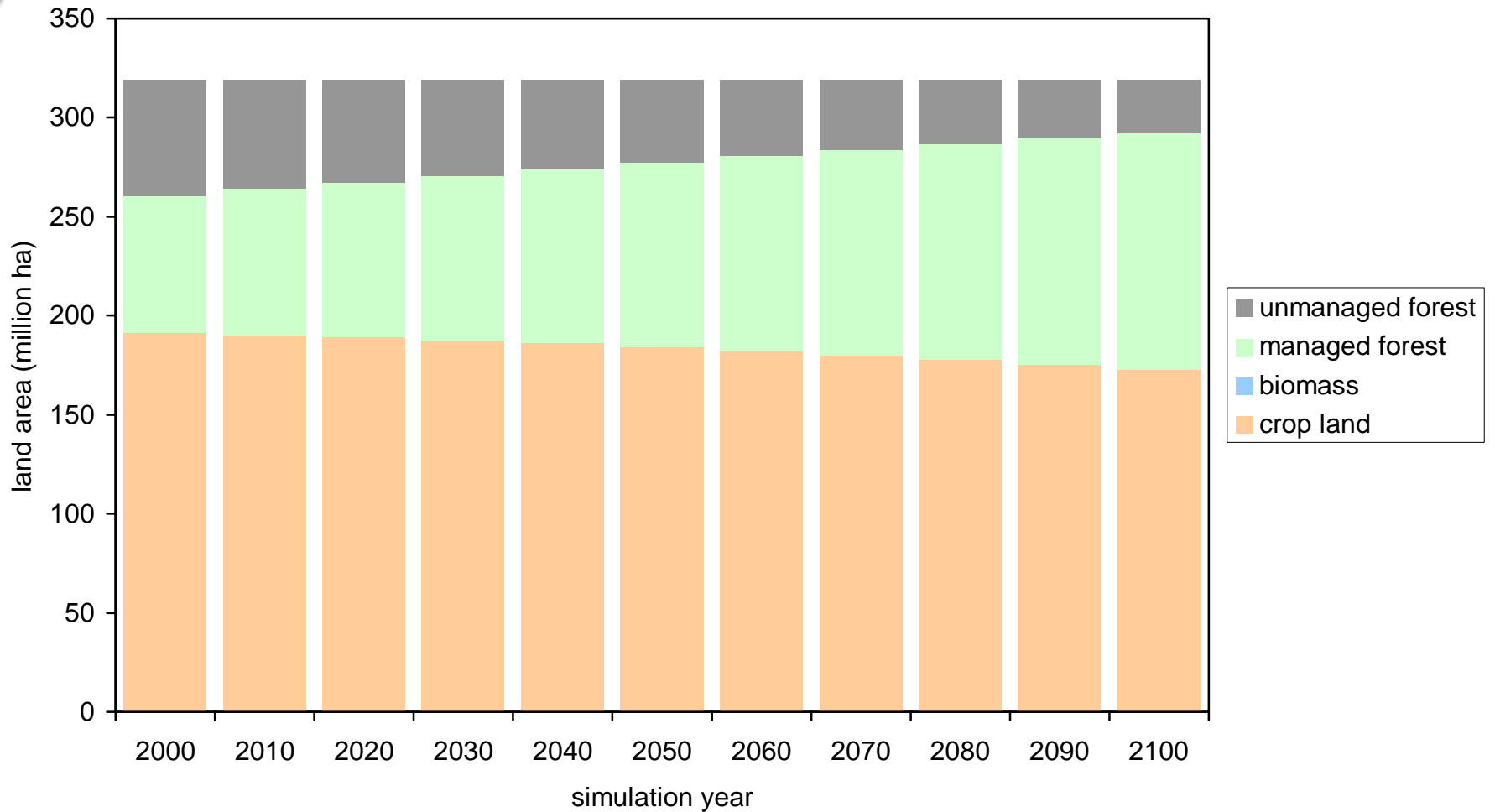
# India Land Simulation with Agricultural Productivity Growing Slower than Population



# India Land Simulation with Agricultural Productivity Same as Population Growth Rate



# India Land Simulation with Agricultural Productivity Growing Faster than Population



# What Next?

## ▶ Near Term

- Alternative biofuel pathways
- Enhancements to India model
  - Demand and supply of fuelwood
  - Land subregions

## ▶ Longer Term

- International trade and food security
- Valuing carbon in unmanaged land
- Crop rotation and multiple crops per year
- Water as a limiting resource