

# Overview of Integrated Assessment

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# Outline

- What is Integrated Assessment
- Some Background Questions
- Why Do Integrated Assessment
- Differences in Natural and Social Science Perspectives
- Different Types of Integrated Assessment Models
- Contributions of Integrated Assessment
  - Internal Consistency Checks
  - Insights Like The Four Flexibilities
  - Rough Numbers To Guide Policy Development
  - Research Prioritization
- Examples of Integrated Assessment
- Frontiers in Integrated Assessment
  - Coping With Complexity
  - Incorporating Uncertainty
  - Embracing Technological Change
  - Integrating the Sciences
  - Synthesizing the Impacts
  - Promoting Development
- Assessing Assessments
  - Peer Reviewed Proposals/Literature
  - Forum Analysis
  - Model Assessment Projects
  - PCMDI-Like Institution

# What is Integrated Assessment of Climate Change Policy?

- Many definitions of IA for many purposes
- Here we call integrated assessment of climate change policy any attempt to bring together the costs and benefits of climate change policies in a systematic manner

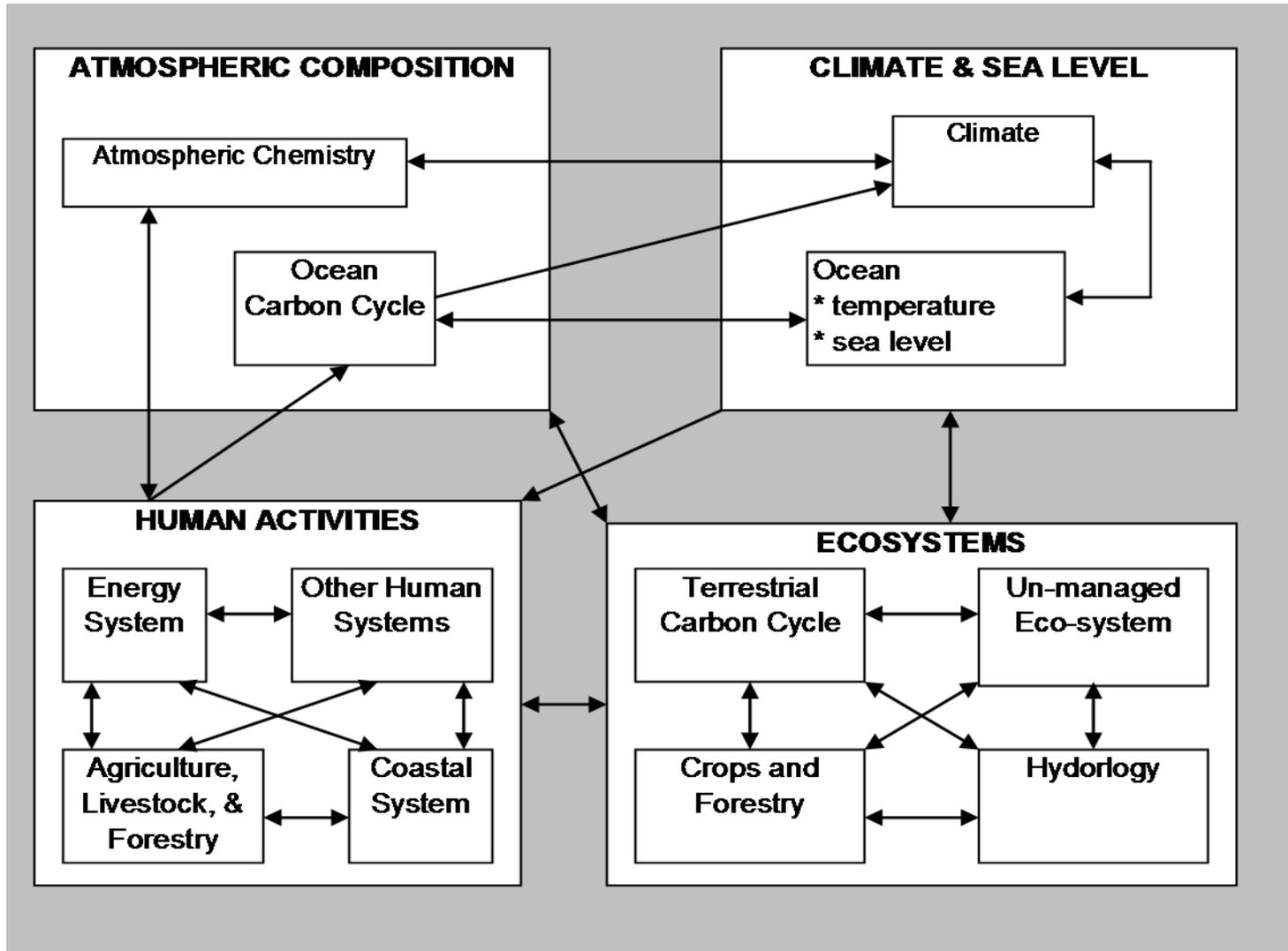
# Background Questions

- Why assess?
  - Need insights and numbers for policy development
- Why model?
  - Consistency
  - Insights
  - Learning
  - Rough numbers +sensitivities
- What principles to use?
  - Disciplinary differences
  - What is empirical evidence?
- How should models be evaluated?
  - Backcasting
  - Model assessment
- Who decides these things?
  - Disciplines, national academies, lawyers, us

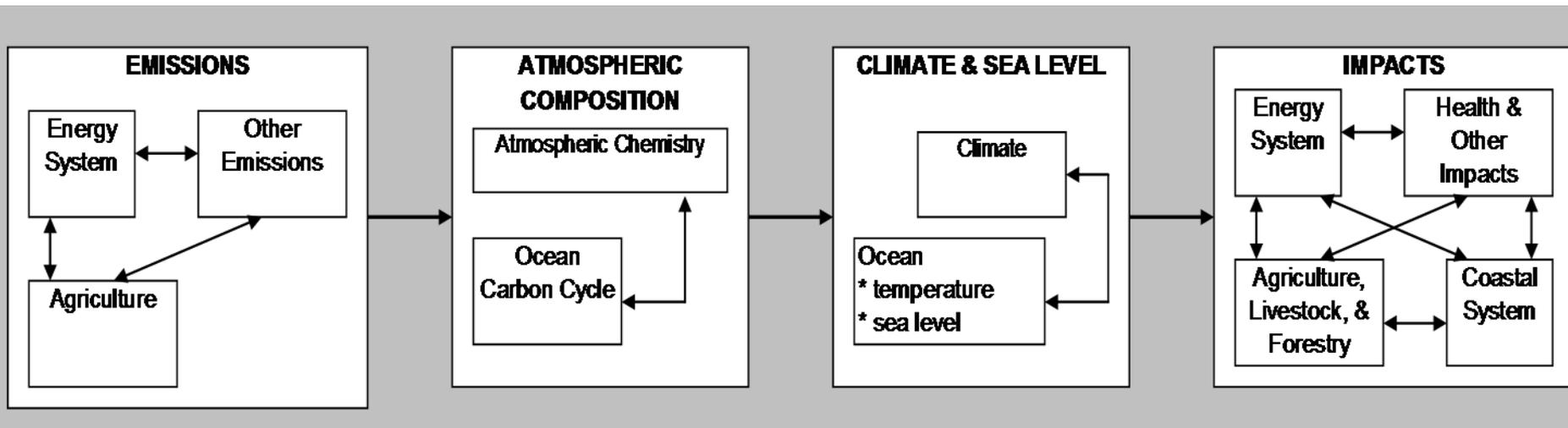
# Some Things We Find in Economics, But Not in Physics or Biology

- Preferences (possibly changing over time)
- Expectations (certainly changing over time)
- The ability to make contingent decisions
- These characteristics may lead to differences in:
  - Framing questions
  - Modeling systems
  - Integrating models
  - Assessing models

# Fully Integrated Approach to Integrated Assessment



# End to End Approach to Integrated Assessment



# Two Kinds of Integrated Assessment Models

- Policy Optimization Models
  - Focused on Finding Optimal Level of Emissions
  - Usually Include Impacts at the Aggregate Level
- Policy Evaluation Models
  - Focused on Simulating Effects of Policies
  - Usually More Detailed Impacts
  - Can be Run Backwards - Tolerable Windows Approach

# Types of Integrated Assessment Models

## Deterministic Models

Deterministic  
Policy Optimization Models

Deterministic  
Policy Evaluation Models

## Decision Making Under Uncertainty Models

Stochastic  
Policy Optimization Models

Stochastic  
Policy Evaluation Models

# Uses Of Integrated Assessment Models

## Deterministic Models

### Deterministic Policy Optimization Models

- Compute Optimal Carbon Taxes, Control Rates, etc.
- Calculate Costs of Meeting Emission/Concentration/Climate/Impact Targets

### Deterministic Policy Evaluation Models

- Insure Consistency in Assumptions
- Assess Interactions and Feedbacks
- Identify Critical Gaps in Research

## Decision Making

### Under Uncertainty Models

### Stochastic Policy Optimization Models

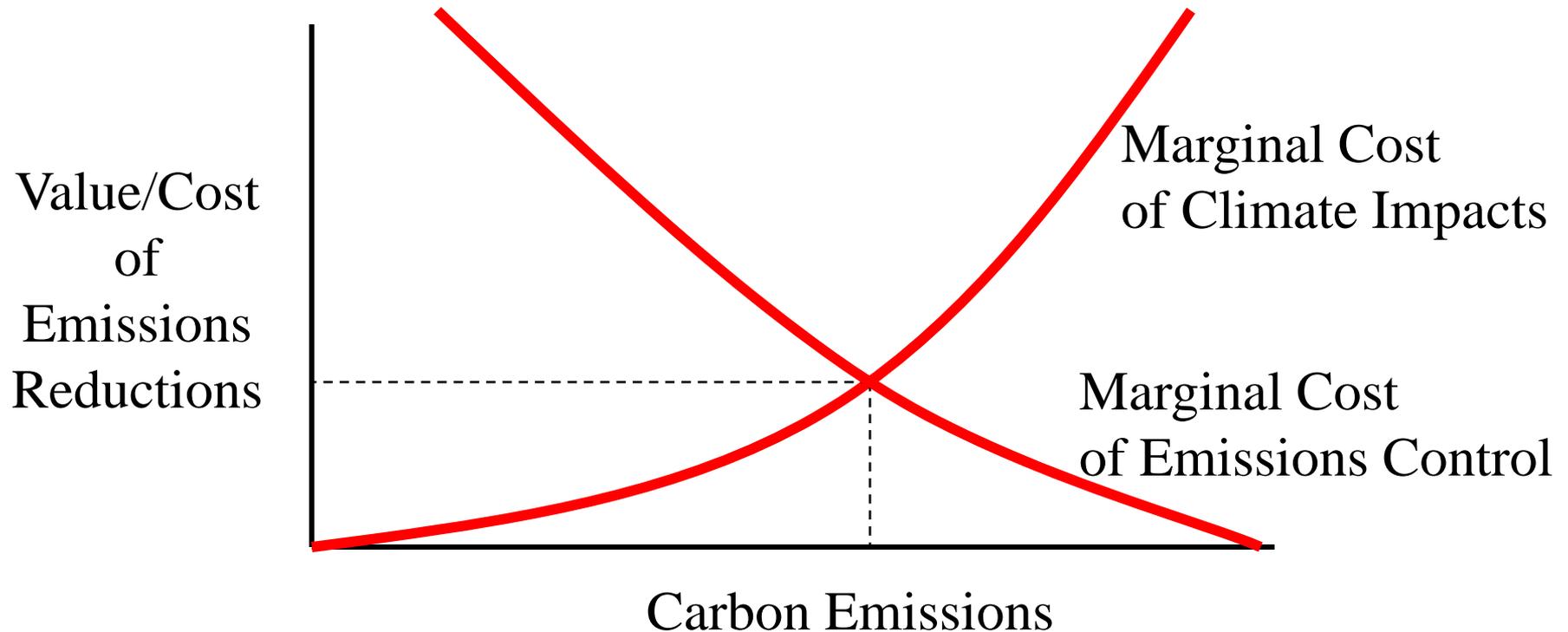
- Assess Optimal Policies Under Uncertainty
- Compute Value of Information/Research

### Stochastic Policy Evaluation Models

- Compute Probabilities of Cost/Benefits of Climate Policies
- Compute Probabilities of Meeting Targets

# Cost/Benefit Modeling Approach:

Balancing the Costs of Controlling Carbon Emissions  
Against the Costs of the Climate impacts They Cause



# Example#1: C/B Results From Nordhaus “A Question of Balance” Book 7/2008

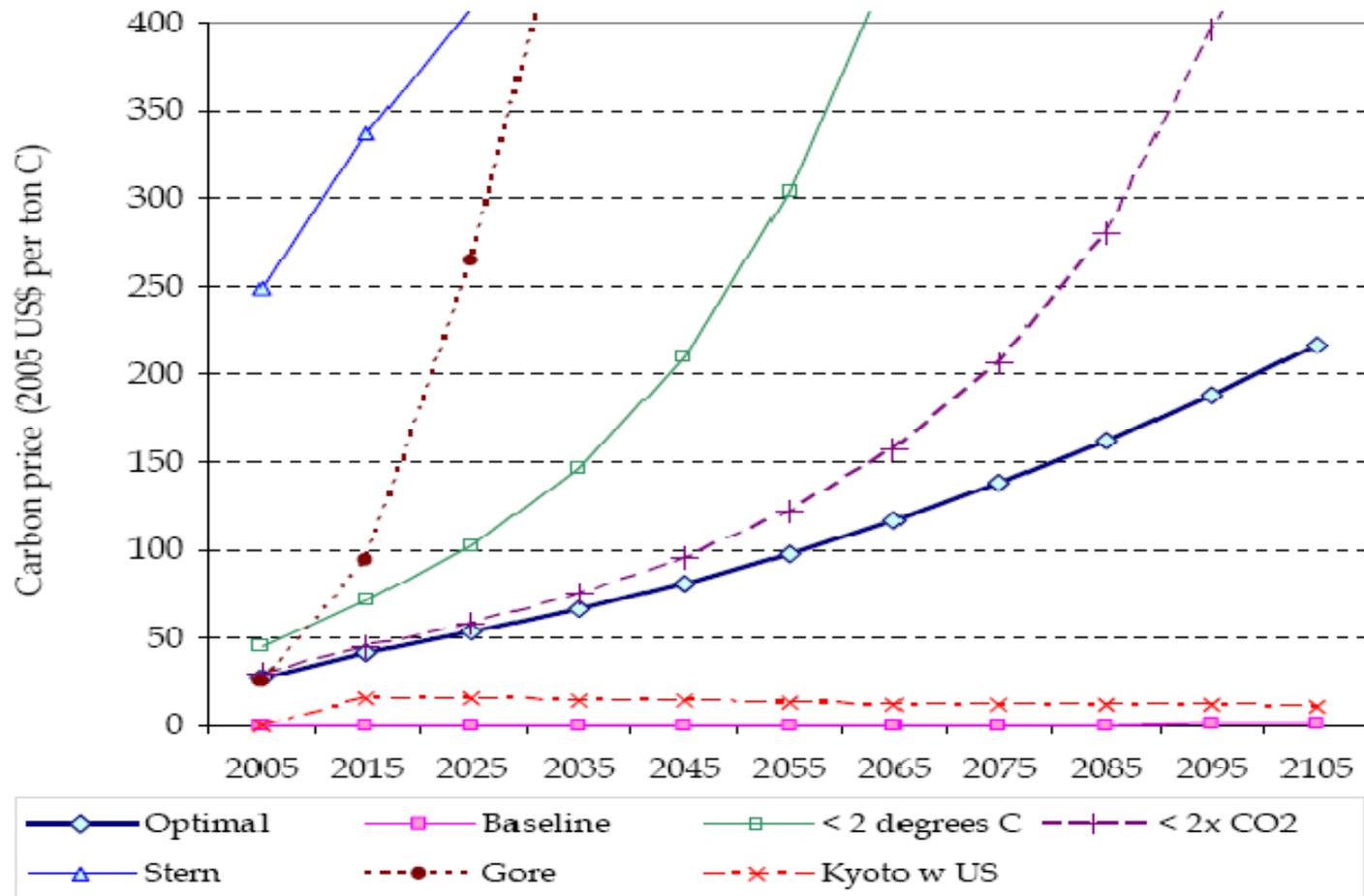


Figure V-4. Carbon prices for different strategies

# Example#1: C/B Results From Nordhaus

## “A Question of Balance” Book 7/2008

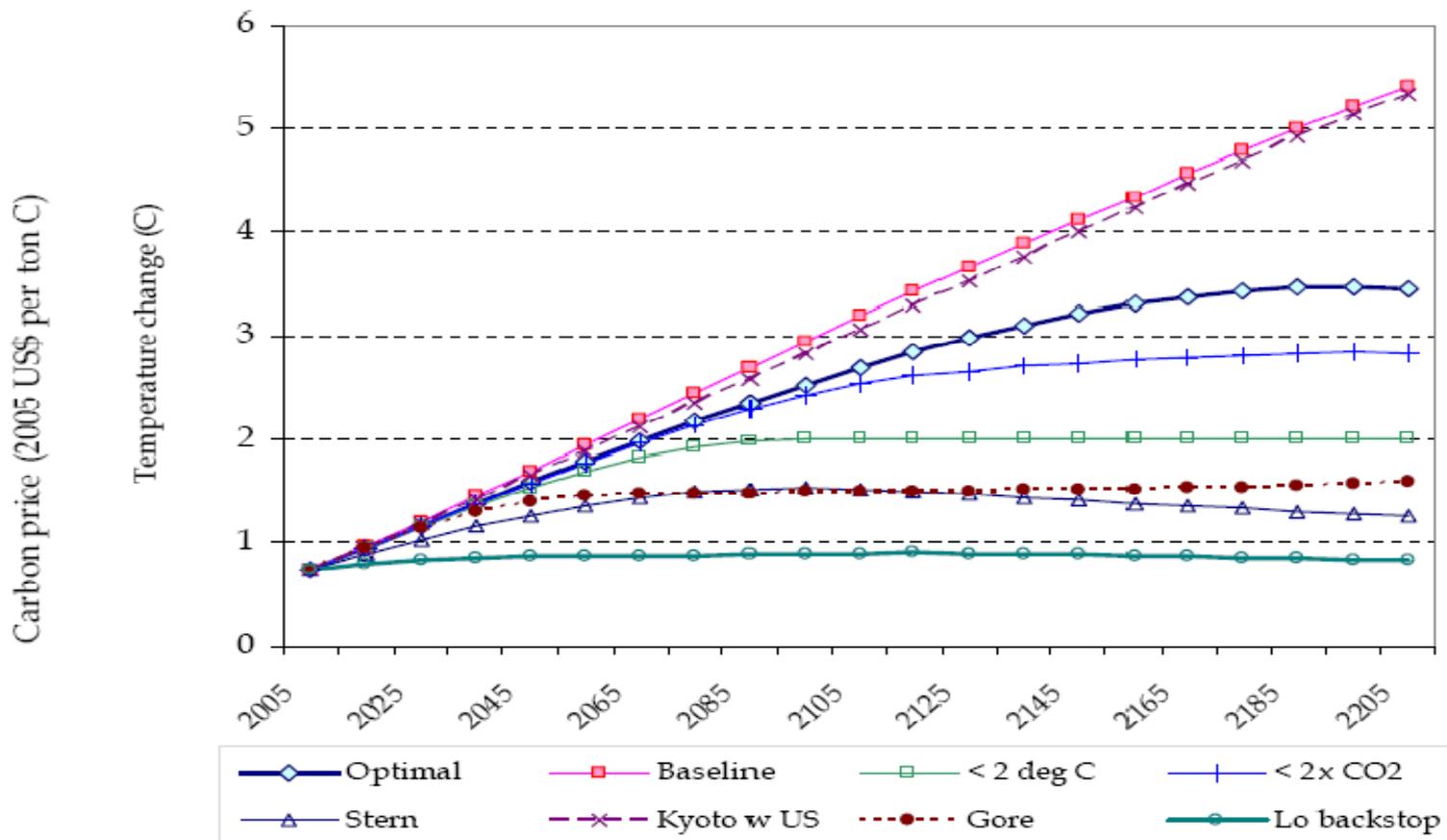


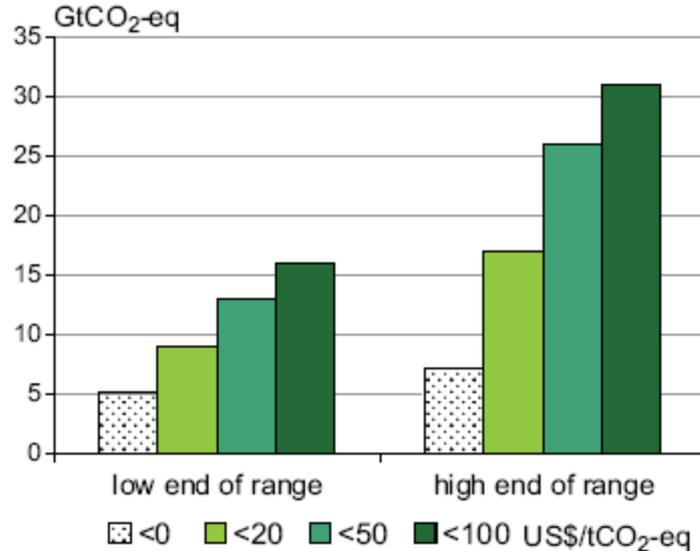
Figure V-8. Projected global mean temperature change by policy

Figure V-4. Carbon prices for different strategies

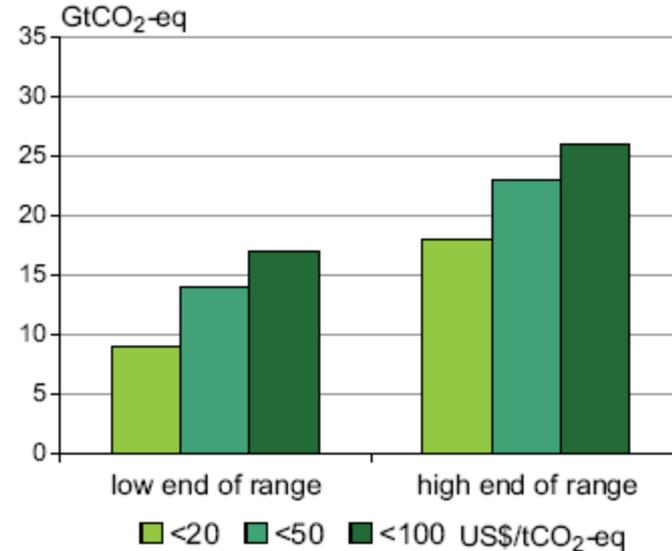
# Components of Mitigation Costs

- Direct resource costs
- Indirect opportunity costs
  - Less of one commodity, but perhaps more of another
  - Can include shifts in industry structure
  - Can include trade impacts
- Economic growth impacts
  - Tied into capital accumulation
  - Also depends heavily on technological change
- Dis-equilibrium impacts

# And Then We Have The Bottom-Up Engineering Models: IPCC AR4 Global Mitigation Cost Estimates



**Figure SPM.5A:** Global economic mitigation potential in 2030 estimated from bottom-up studies (data from Table SPM.1)



**Figure SPM.5B:** Global economic mitigation potential in 2030 estimated from top-down studies (data from Table SPM.2)

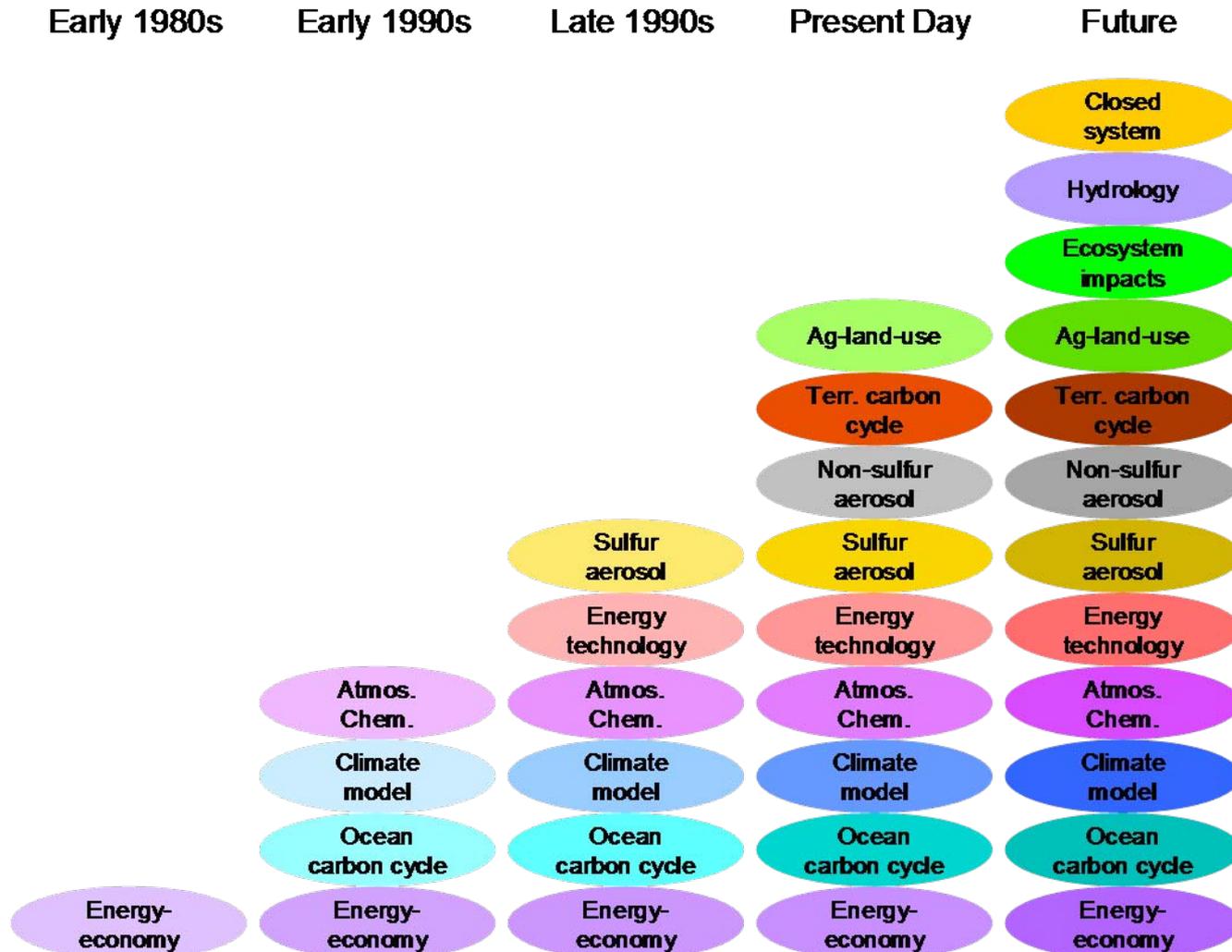
# A Range of Approaches to Projecting Mitigation Costs

Table 3.12: *Top-down models assessed for mitigation opportunities in 2030*

Model	Model type	Solution concept	Time horizon	Modelling team and reference
AIM (Asian-Pacific Integrated Model)	Multi-Sector General Equilibrium	Recursive Dynamic	Beyond 2050	NIES/Kyoto Univ., Japan Fujino <i>et al.</i> , 2006.
GRAPE (Global Relationship Assessment to Protect the Environment)	Aggregate General Equilibrium	Inter-temporal Optimization	Inter-temporal Optimization	Institute for Applied Energy, Japan Kurosawa, 2006.
IMAGE (Integrated Model to Assess The Global Environment)	Market Equilibrium	Recursive Dynamic	Beyond 2050	Netherlands Env. Assessment Agency Van Vuuren <i>et al.</i> , Energy Journal, 2006a. (IMAGE 2.2) Van Vuuren <i>et al.</i> , Climatic Change, 2007. (IMAGE 2.3)
IPAC (Integrated Projection Assessments for China)	Multi-Sector General Equilibrium	Recursive Dynamic	Beyond 2050	Energy Research Institute, China Jiang <i>et al.</i> , 2006.
MERGE (Model for Evaluating Regional and Global Effects of GHG Reduction Policies)	Aggregate General Equilibrium	Inter-temporal Optimization	Beyond 2050	EPRI & PNNL/Univ. Maryland, U.S. USCCSP, 2006.
MESSAGE-MACRO (Model for Energy Supply Strategy Alternatives and Their General Environmental Impact)	Hybrid: Systems Engineering & Market Equilibrium	Inter-temporal Optimization	Beyond 2050	International Institute for Applied Systems Analysis, Austria Rao and Riahi, 2006.
MiniCam (Mini-Climate Assessment Model)	Market Equilibrium	Recursive Dynamic	Beyond 2050	PNNL/Univ. Maryland, U.S. Smith and Wigley, 2006.
SGM (Second Generation Model)	Multi-Sector General Equilibrium	Recursive Dynamic	Up to 2050	PNNL/Univ. Maryland and EPA, U.S. Fawcett and Sands, 2006.
POLES (Prospective Outlook on Long-Term Energy Systems)	Market Equilibrium	Recursive Dynamic	Up to 2050	LEPII-EPE & ENERDATA, France Criqui <i>et al.</i> , 2006.
WIAGEM (World Integrated Applied General Equilibrium Model)	Multi-Sector General Equilibrium	Inter-temporal Optimization	Beyond 2050	Humboldt University and DIW Berlin, Germany Kemfert <i>et al.</i> , 2006.

Source: Weyant *et al.*, 2006.

# Evolution of IA Modeling



Source: J. Edmonds - JGCRI

# RCP Candidates:

## Published Scenarios With All Gases

*Table 2. RCP candidates. Asterisks indicate that at least one scenario is available, although there may be more than one.*

IAM (affiliation) <sup>1</sup>	RCP8.5	RCP6	RCP4.5	RCP3-PD	Reference(s)
AIM (NIES)		* <sup>2</sup>	*	* <sup>2</sup>	Fujino et al. (2006) <sup>ć</sup> Hijioka et al. (2008)
GRAPE (IAE)			*		Kurosawa (2006)
IGSM (MIT)	*	*	*		Reilly et al. (2006) <sup>ć</sup> Clarke et al. (2007)
IMAGE (MNP)	*	*	*	*	van Vuuren et al. (2006 <sup>ć</sup> 2007)
IPAC (ERI)		* <sup>2</sup>	*		Jiang et al. (2006)
MESSAGE (IIASA)	*	*	*	*	Rao and Riahi (2006) <sup>ć</sup> Riahi et al. (2007)
MiniCAM (PNNL)		*	*		Smith and Wigley (2006) <sup>ć</sup> Clarke et al. (2007)

Notes:

<sup>1</sup> AIM = Asia-Pacific Integrated Model<sup>ć</sup>NIES = National Institute for Environmental Studies<sup>ć</sup>GRAPE = Global Relationship to Protect the Environment<sup>ć</sup>IAE = Institute of Applied Energy<sup>ć</sup>IGSM = Integrated Global System Model<sup>ć</sup>MIT = Massachusetts Institute of Technology<sup>ć</sup>IMAGE = Integrated Model to Assess the Global Environment<sup>ć</sup>MNP = Netherlands Environmental Assessment Agency<sup>ć</sup>IPAC = Integrated Policy Assessment Model for China<sup>ć</sup>ERI = Energy Resource Institute<sup>ć</sup>MESSAGE = Model for Energy Supply Strategy Alternatives and their General Environmental Impact<sup>ć</sup>MiniCAM = Mini-Climate Assessment Model<sup>ć</sup>PNNL = Pacific Northwest National Laboratory.

<sup>2</sup> These scenarios are available<sup>ć</sup>but would require revisions to meet the RCP forcing criteria.

# Areas Where Climate Change Impacts Are Anticipated

## MARKET

- **Agriculture**
- **Forestry**
- **Sea Level Rise**
- **Water Supply**
- **Energy Consumption**
- **Fisheries**
- **Extreme Events/Insurance**

\*Some Market Components

## NON-MARKET

- **Unmanaged Eco-Systems**
  - Terrestrial
  - Marine
- **Human Health\***
- **Bio-Diversity\***
- **Wildlife**
- **Recreation\***
- **Amenities**

# Approaches to Integration of Costs & Benefits

- Do Informally Through Careful Choice of Target and Then Minimize Costs to Achieve
- Iterate Between Tolerable Windows and Optimization Approaches
- Formal Cost/Benefit Analysis

# Contributions of Integrated Assessment

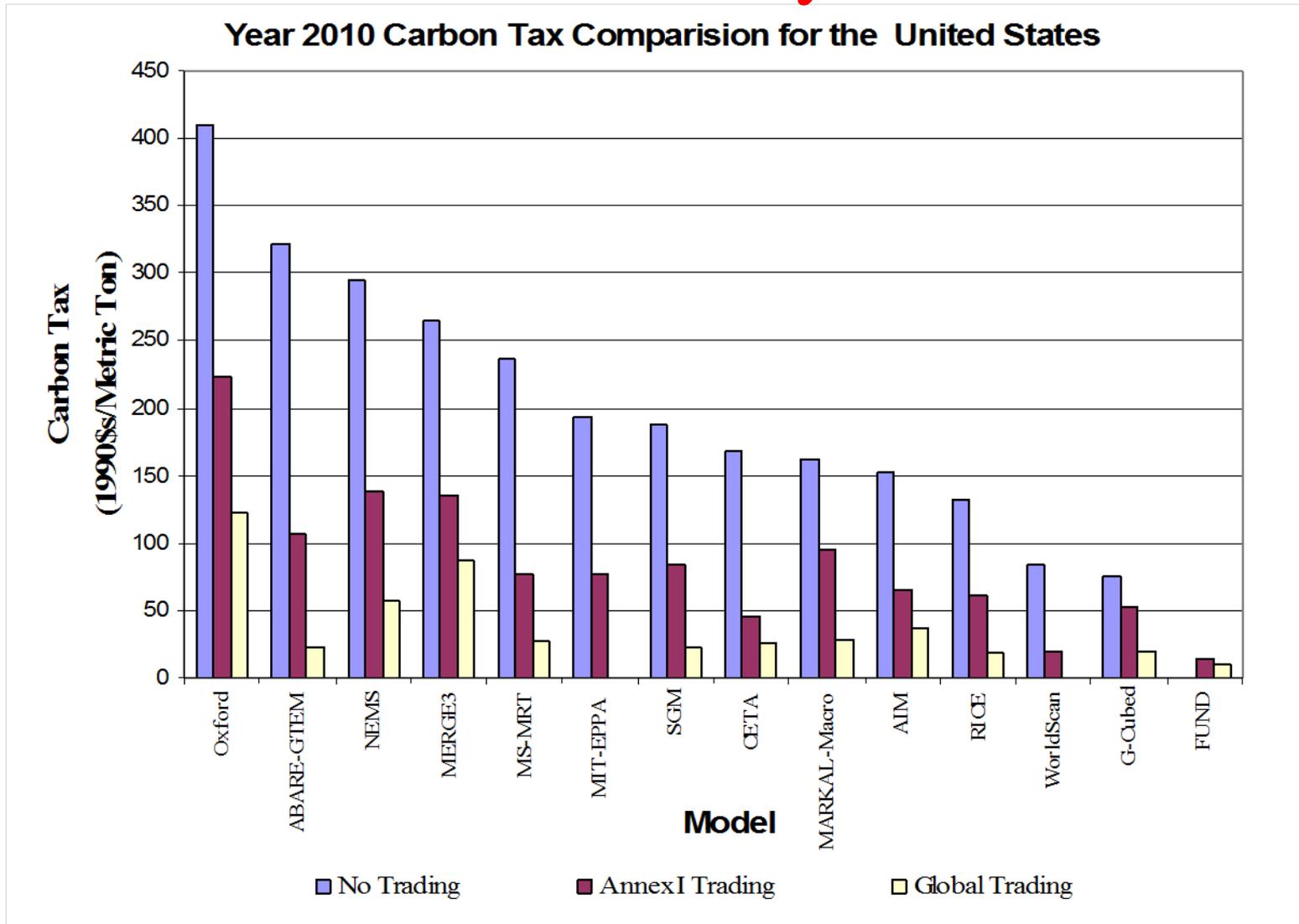
- Internal Consistency Checks
- Insights Like The Four Flexibilities
- Rough Numbers To Guide Policy Development
- Research Prioritization

# Four Kinds of Mitigation Policy Flexibilities

1. Where Flexibility
2. When Flexibility
3. How Flexibility
4. What Flexibility

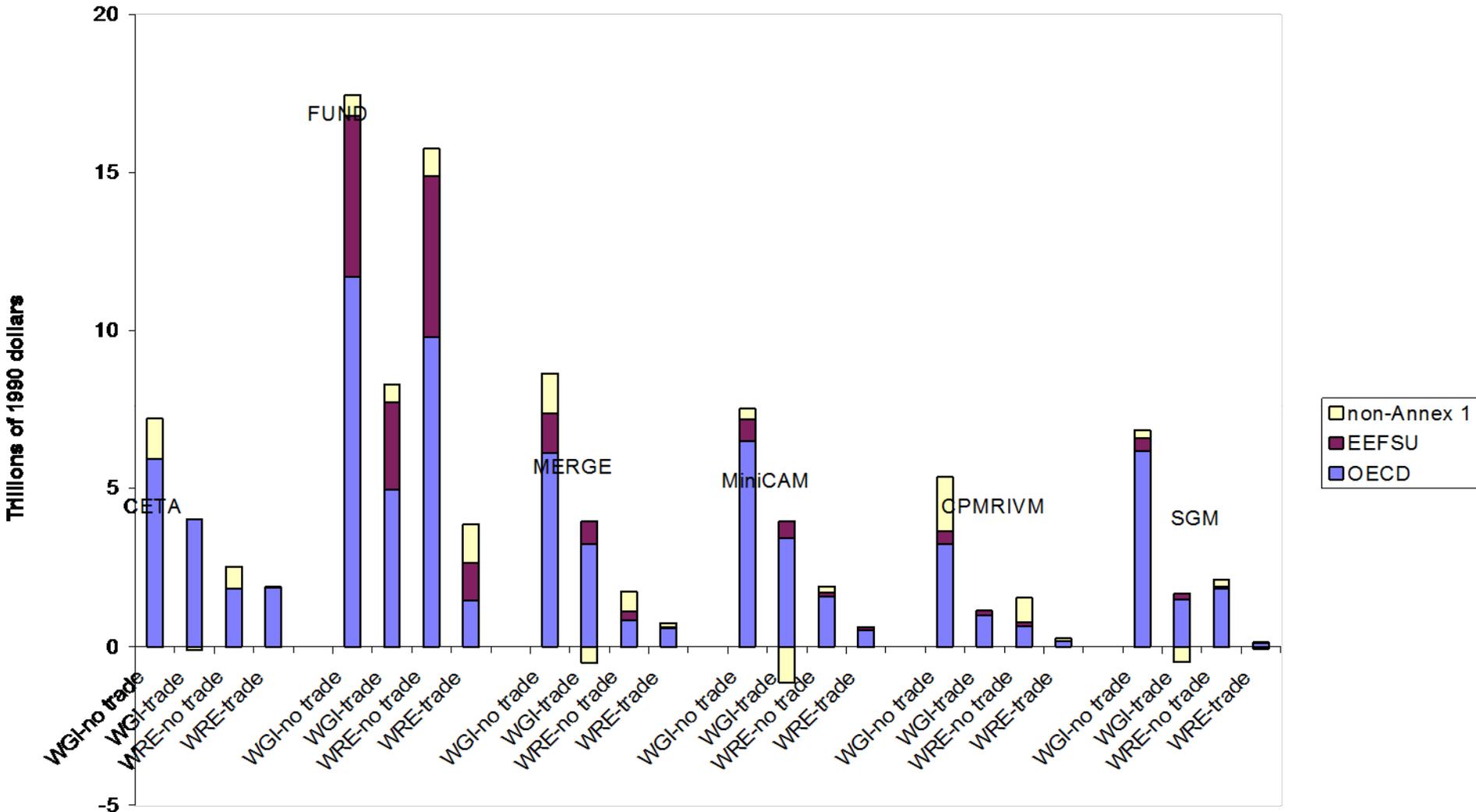
# 1. Where Flexibility

## The Cost of Kyoto



# 2. Where and When Flexibility

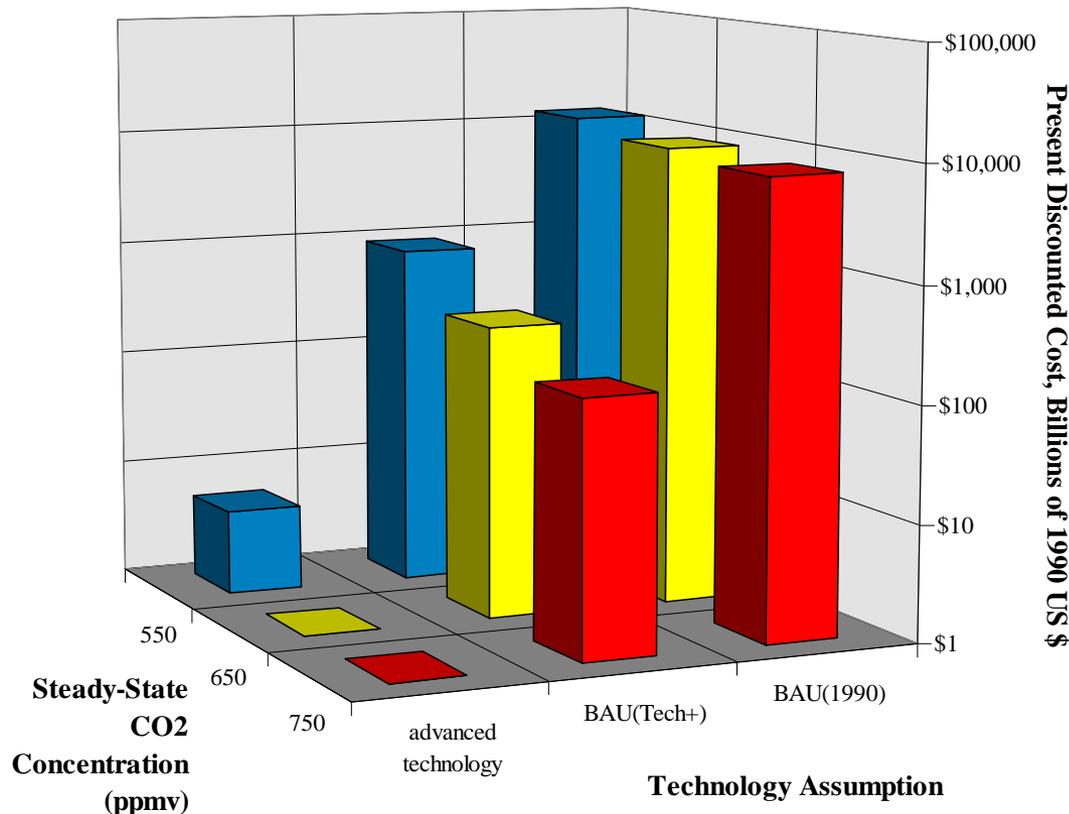
Costs of Stabilizing Concentrations at 550 ppmv -- discounted to 1990 at 5 %



# 3. How Flexibility

## The VALUE OF DEVELOPING NEW ENERGY TECHNOLOGY

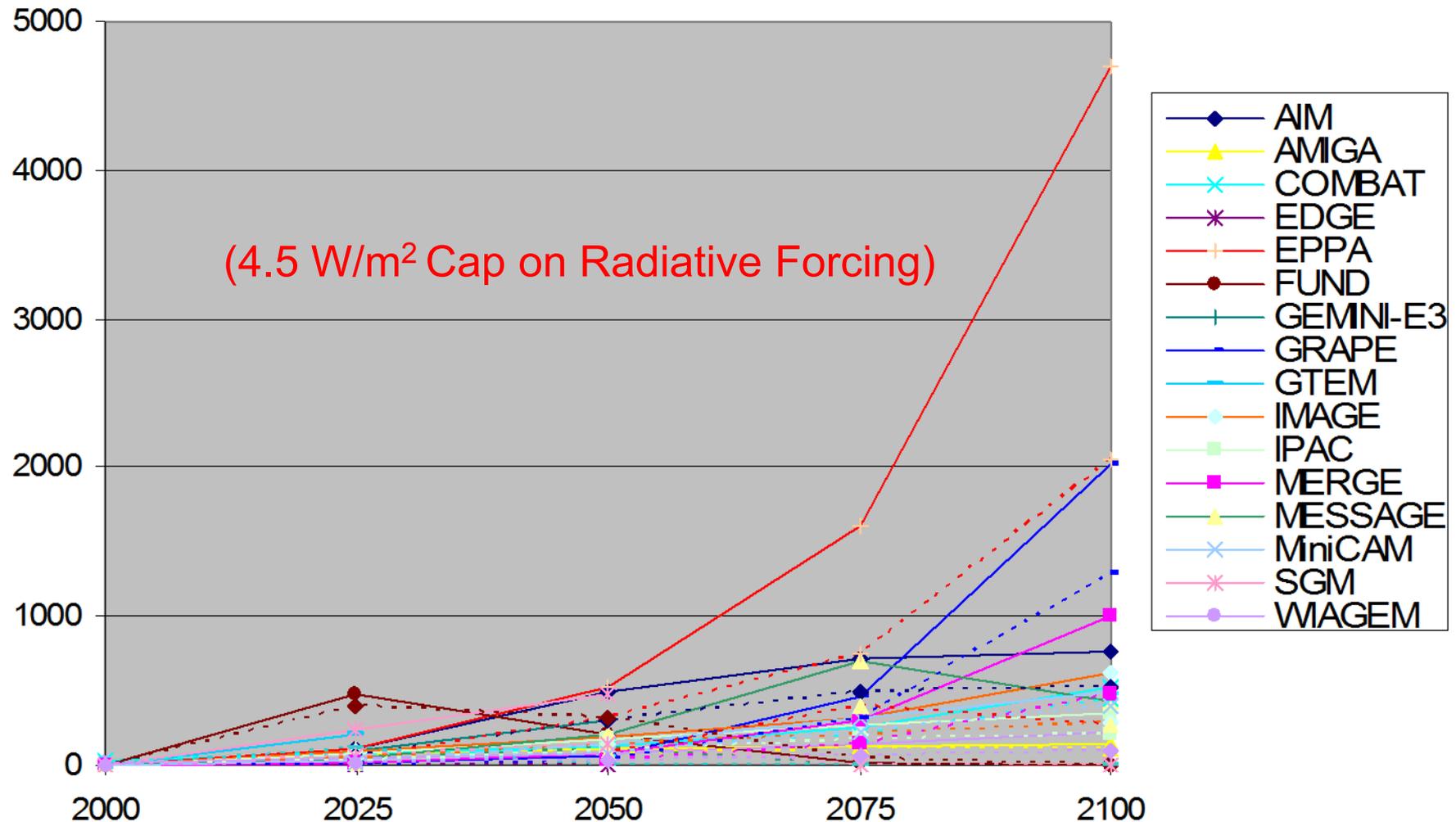
*(Present Discounted Costs to Stabilize the Atmosphere)*



Minimum Cost  
Based on Perfect  
Where & When  
Flexibility  
Assumption.  
Actual Cost  
Could be An  
Order of  
Magnitude  
Larger.

# 4. What Flexibility

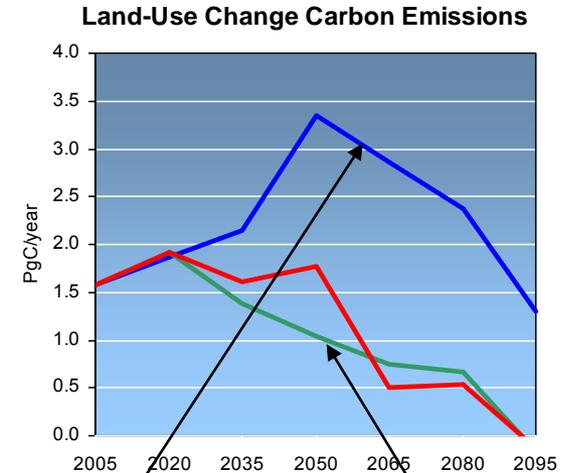
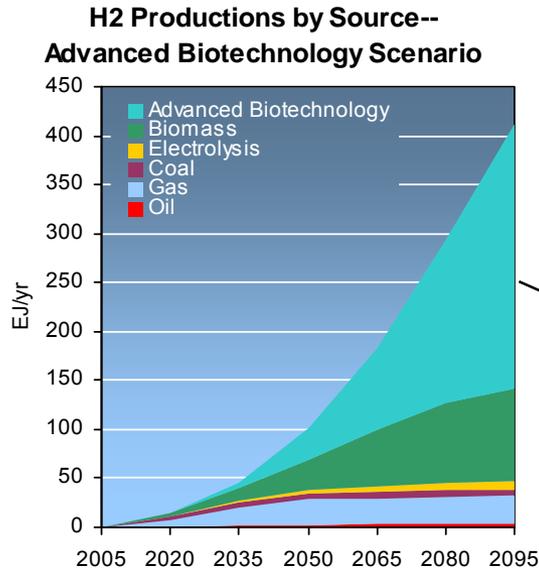
Carbon Permit Price (2000 \$USD / tC)  
in CO2-Only (solid) and Multigas (dashed) Scenarios



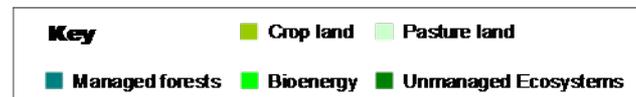
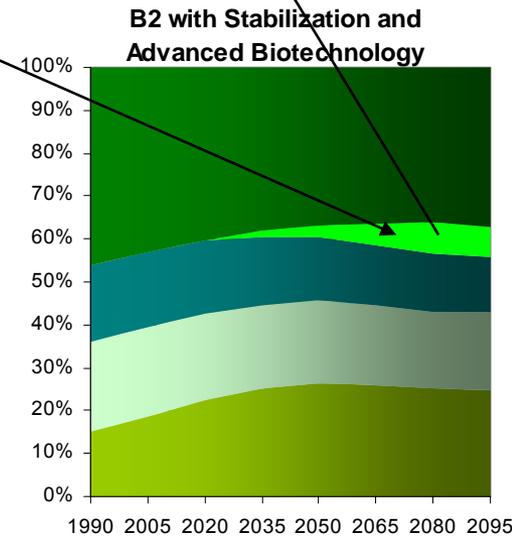
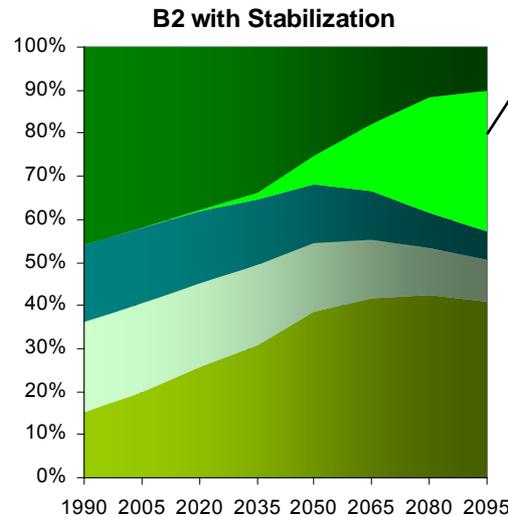
# Some Areas Where Some Integration Has Proven Useful

- Biological Sinks
- CO<sub>2</sub> Fertilization
- Sulfate Aerosols
- Biofuels Assessments
- Health Impact Assessments

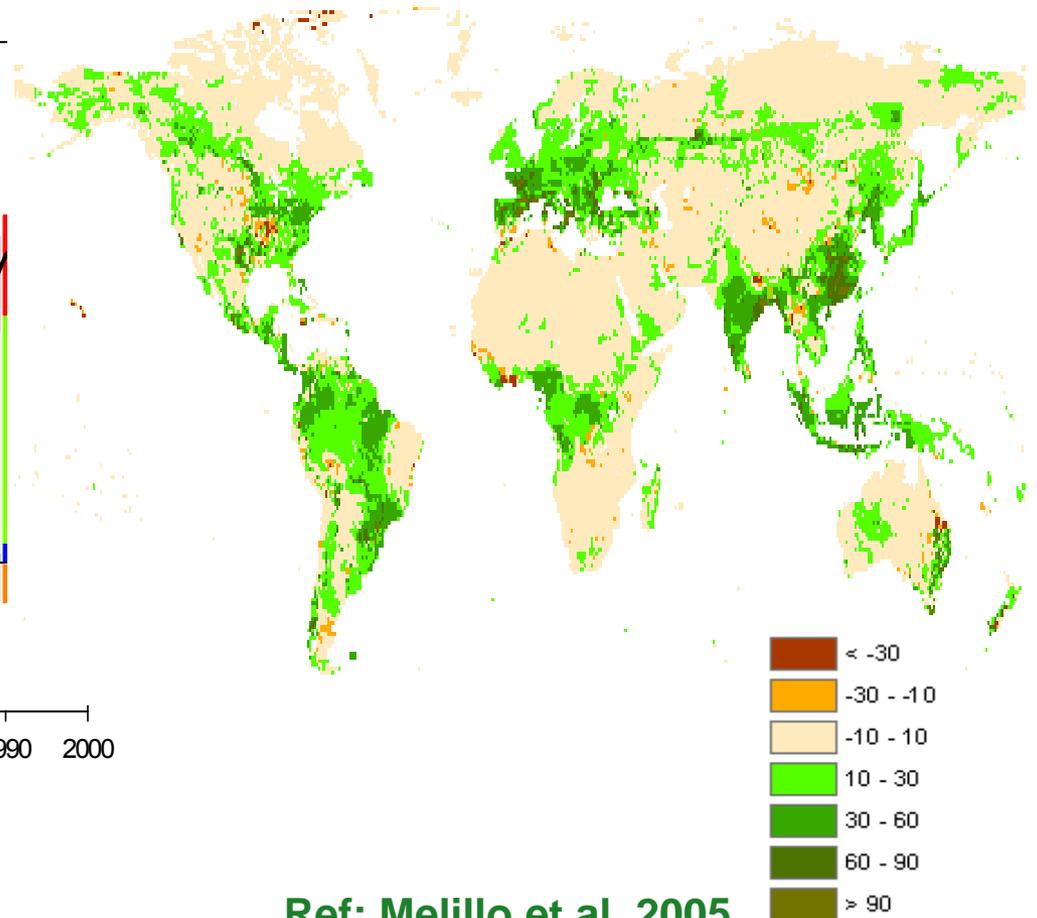
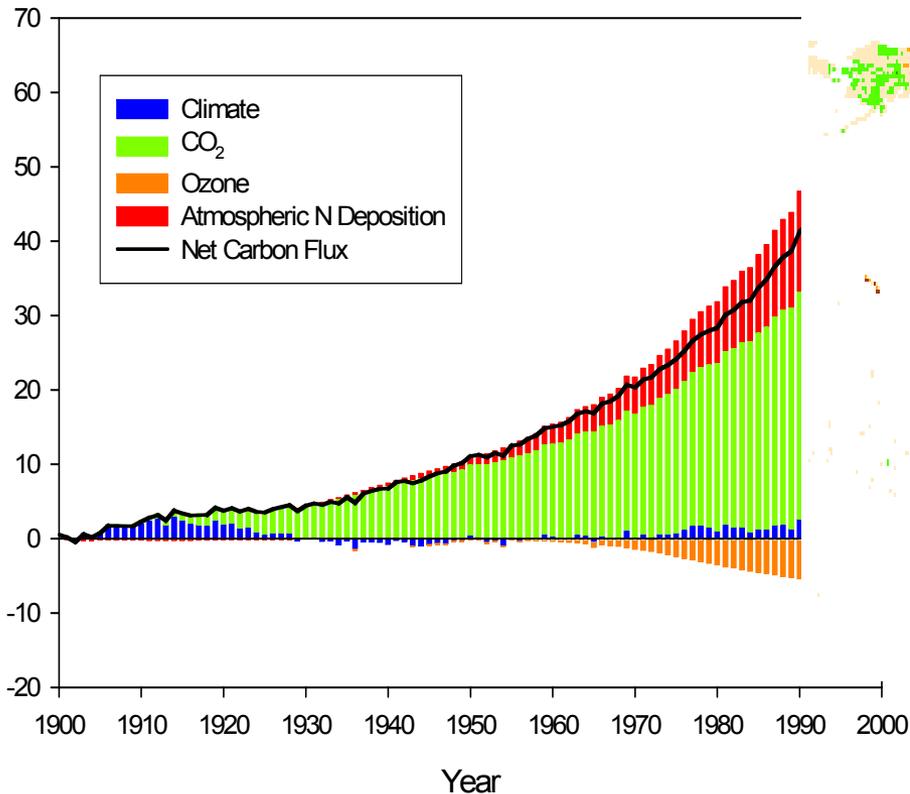
# Example Application #2: Breakthroughs in Biological Science



*Against a background of limiting GMST to 2°C, what if agricultural and biomass crop productivities could be enhanced and a biological source of H<sub>2</sub> that is cost-competitive with CH<sub>4</sub> was developed?*



## Example #3: Terrestrial Ecosystem Model addresses impacts of Climate Change & Air Pollution on Carbon Cycle



Ref: Melillo et al, 2005

# Frontiers in Integrated Assessment

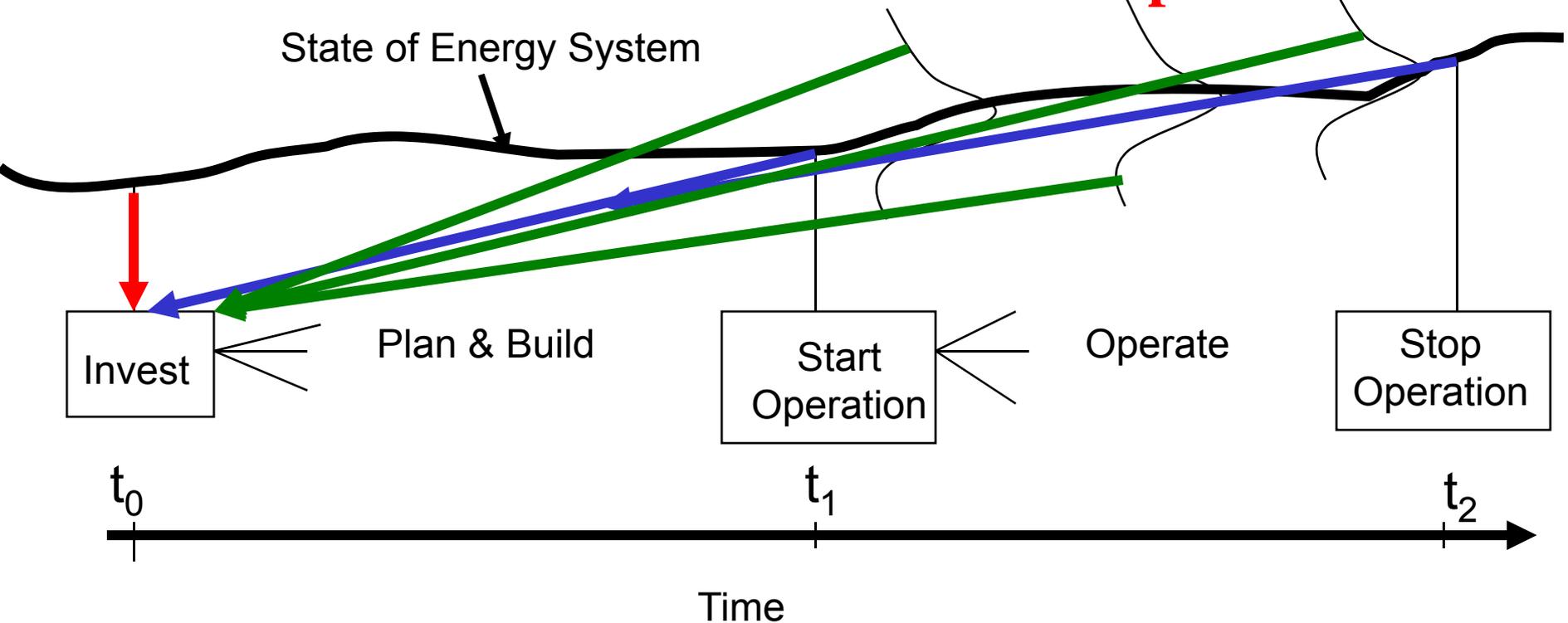
- Coping with complexity
- Incorporating uncertainty
- Embracing technological change
- Integrating the sciences
- Synthesizing the impacts
- Promoting development

# I. Coping With Complexity

- Need to Maintain Problem Focus
- Proliferation of Data, Modules, Interactions
- Need Strategic Approach to Formulation/Implementation
- Lessons From Complexity Theory?
- Operationalize Multi-Level Cyclical Scaling?

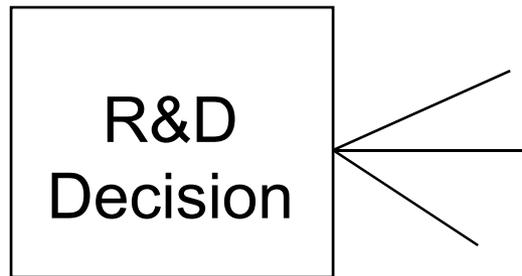
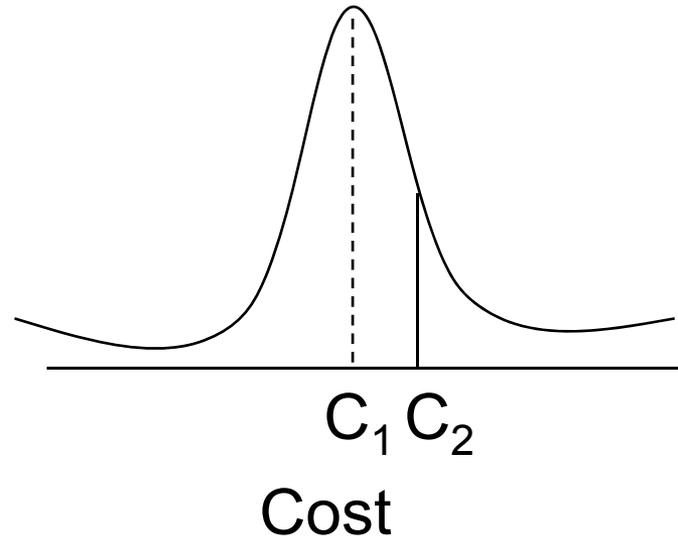
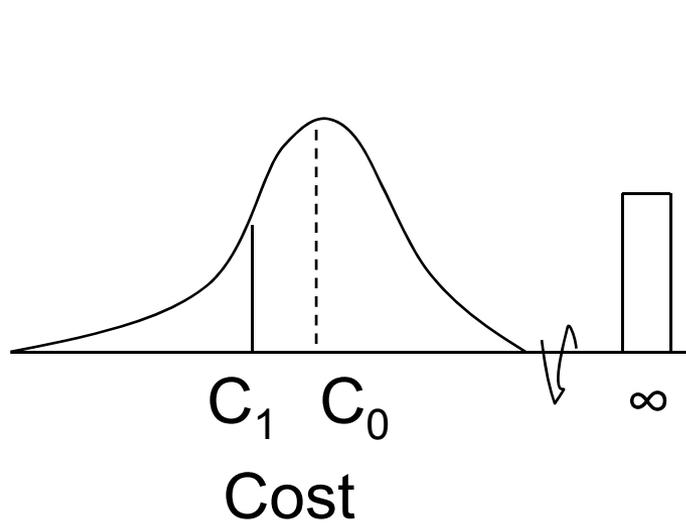
# II. Incorporating Uncertainty

## Information, Foresight & Uncertainty: Three Alternative Sets of Assumptions



- (1) **Static, Myopic, or Recursive Dynamic**
- (2) **Perfect Foresight (Rationale Expectations)**
- (3) **Decision Making Under Uncertainty**

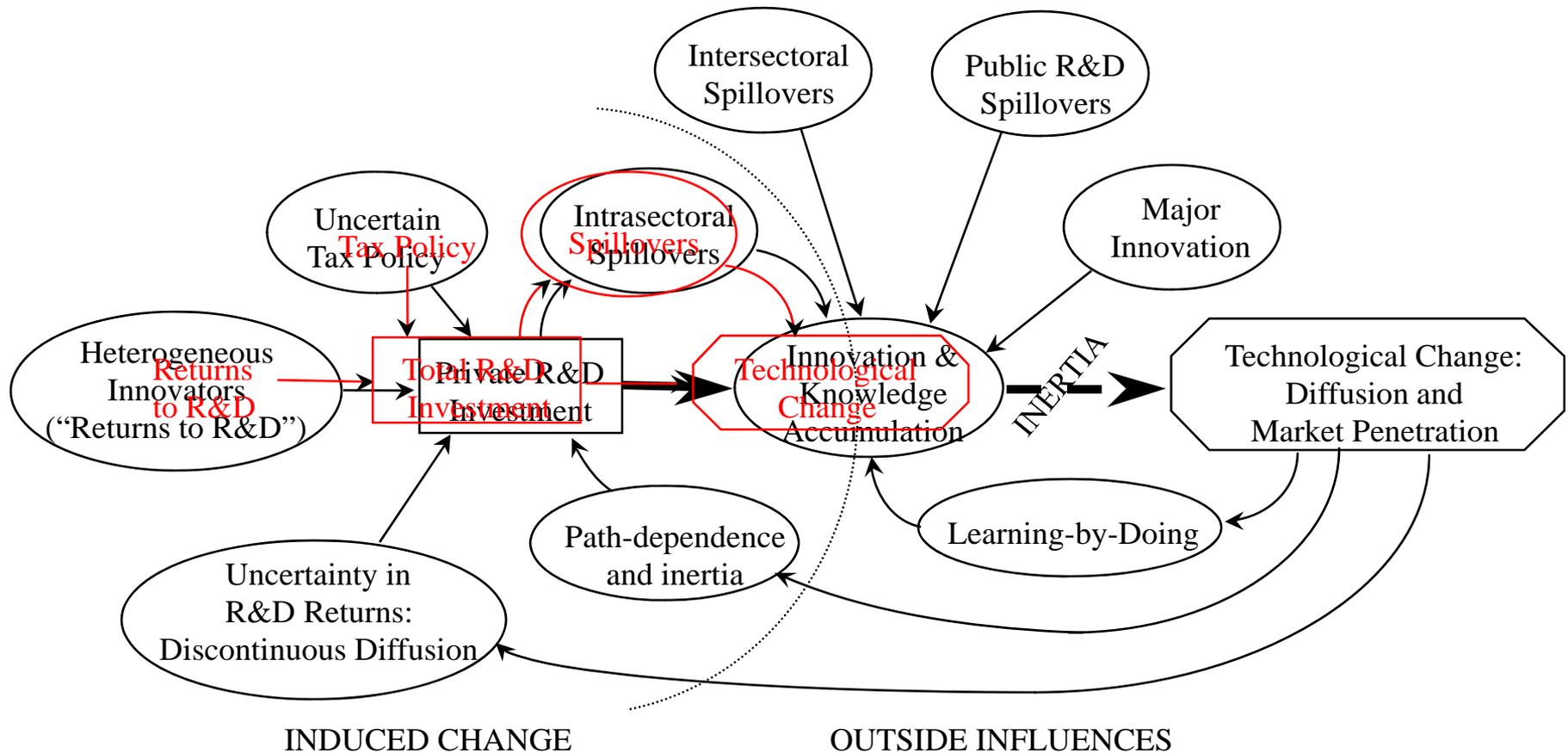
# Interplay Between R&D and Investment Decisions



# III. Embracing Technological Change

## Limitations and Possible Extensions to Current Methods for Modeling ITS

*Current approaches omit important dynamics of technological change. A broader framework for analyzing ITC is needed.*

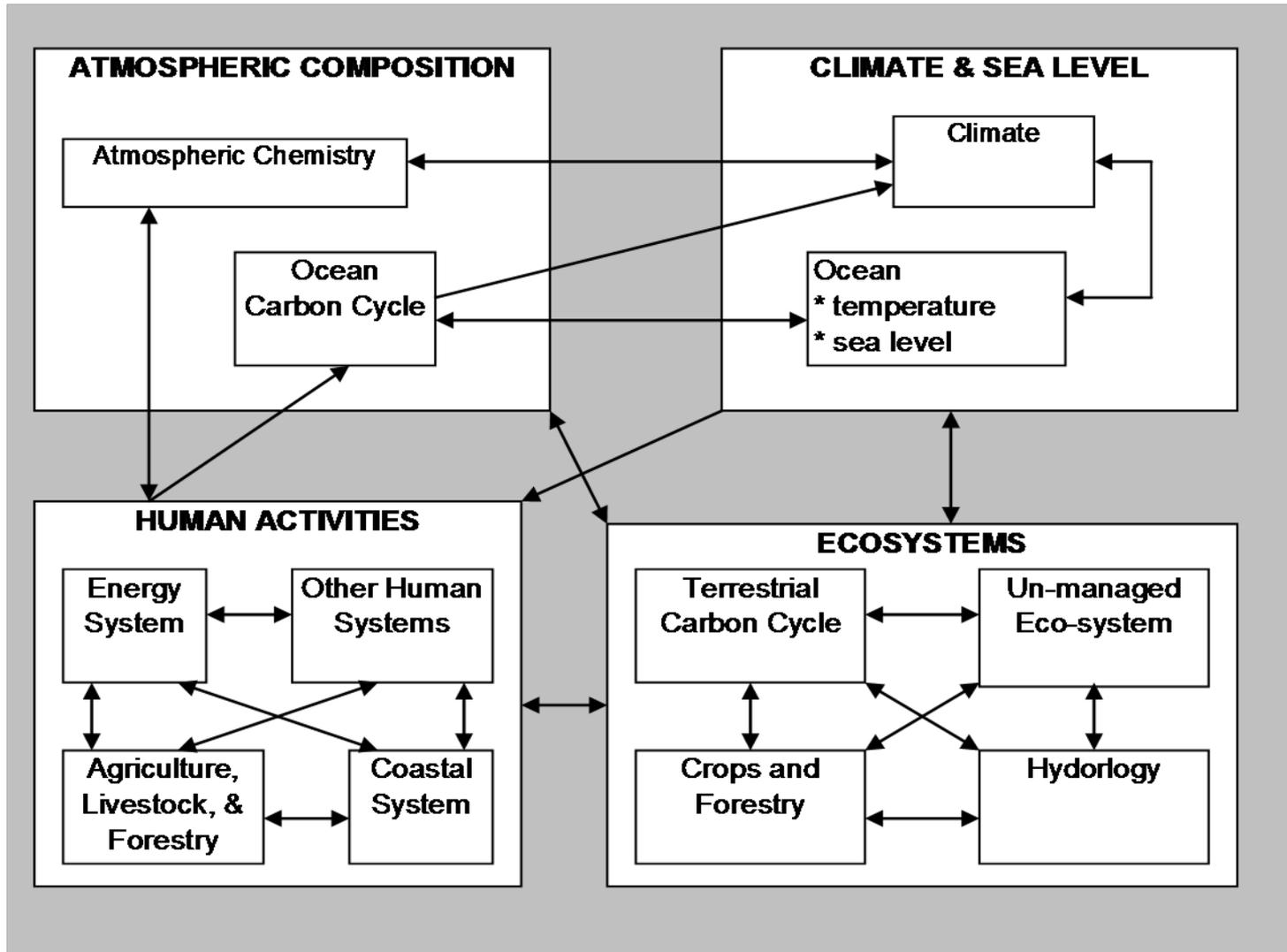


# Observations Regarding Current Approaches to Modeling ITC

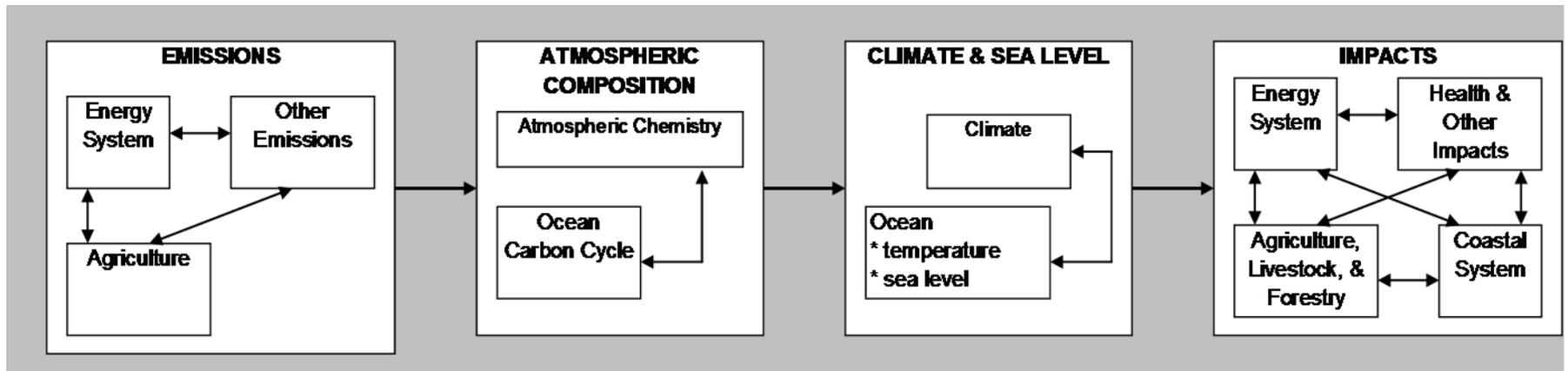
- Current approaches to ITC provide a good foundation:
  - spillovers
  - innovation incentives and knowledge capital
  - heterogeneous firms and technologies
- Current approaches suggest weak or ambiguous effect of ITC, but underestimate importance:
  - Focus only on R&D-based technological change
    - » learning-by-doing
    - » diffusion or imitation by existing technology
  - Assume continuous, known returns to R&D function (no surprises or discontinuities)
    - » No provision for major innovations
    - » Model only one dimension of technological change (cost)
  - Neglect path-dependence and inertia in changing technology dynamics
- **Modeling challenge will be to incorporate enough complexity to realistically capture technology dynamics in a meaningful way.**
- **Policy challenge will be to use insights from models, but qualify findings with a more complete understanding of technological evolution.**

# IV. Integrating The Sciences

## Are We Integrated or...



# ...Still End-to-End ?



Do we need Integrated Earth Systems Models?

# V. Synthesizing The Impacts:

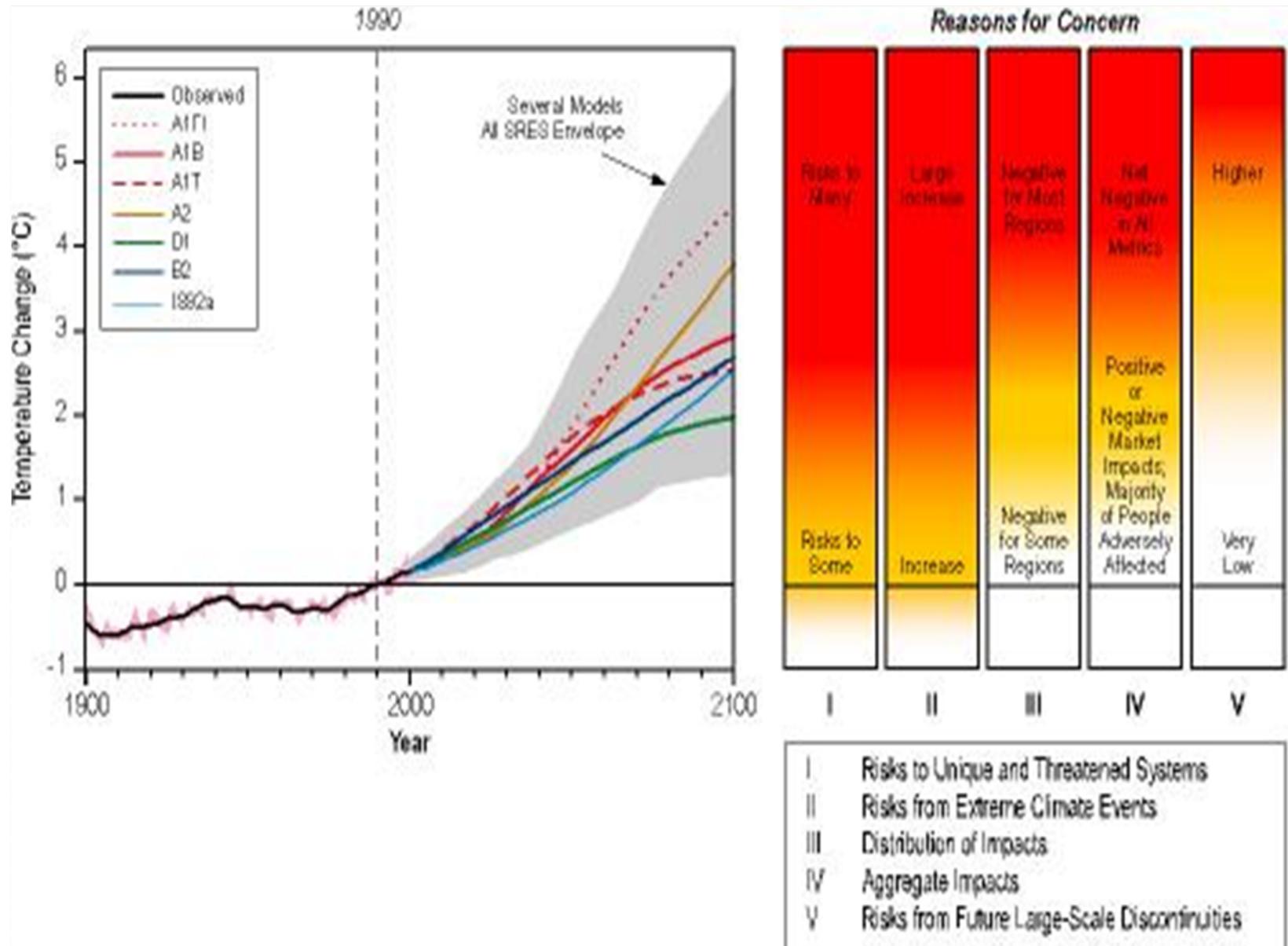
## Where We Are In Impacts/Adaptation Analyses

- Reasonable economics estimates in a few sectors
  - Agriculture
  - Forestry
  - Sea level rise
- Preliminary physical impacts representations in others
  - Health
  - Wildlife
  - Water supply
- First order causal mechanisms in others
  - Unmanaged eco-systems
  - Biodiversity
  - Extreme events – both changes in variability and abrupt changes
- How to weigh what we know and don't know and what we can measure or not measure and what we can value and not value is a big challenge

# Key Challenges Faced in Projecting Impacts

- Projecting Regional Climate
  - Temperature
  - Precipitation
  - Variability
- Projecting Baseline Conditions
- Transient Versus Equilibrium Impacts
- Factoring In Adaptation
- Valuing Non-Market Impacts

# Beyond Flaming Embers ?





# Whither the Poor and Defenseless? A Revealed Preference Study of Climate Change Policy Analyses

<u>Class of</u> <u>World Citizen</u>	<u>Typical OECD</u> <u>(AEA Member?)</u> <u>Analysis</u>	<u>ROW Analysis</u>
2 Billion People Without Markets	What 2 Billion People?	High Priority: Reduce Their Vulnerability
2 Billion In or Near Poverty with Fragile Markets	They Don't Count for Much!	High Priority: Reduce Their Vulnerability
2 Billion Potential Decaf Latté Drinkers	Half Are Stuck In Transition, But the Rest We Can Help	They Can Take Care of Themselves

# Potential Areas of Model Refinement (I)

1. Technology/Technology Change
  - Invention
  - Innovation
  - Diffusion
2. Spatial/Temporal Disaggregation
3. Uncertainty
  - In the World, aka Scenario Uncertainty
  - How it Impacts Behavior of Modeled Agents
  - Related to Degree of Foresight Assumed
4. Data
  - Technology, Energy End Uses, Resources
  - Institutions
  - Economic Output, I/O, Fuel Markets, Trade

# Potential Areas of Model Refinement (II)

5. Representation of Market Imperfections
6. Representation of “Non-Rational” Behavior
7. Ability to Analyze “Plausible” Policies
  - Standards
  - Sectoral Caps
  - Remedies for Market Imperfections
8. Macro/Microeconomic Integration
9. Public Finance/Financial Market Integration
10. Marrying Conceptual Structures With Data

# Integrated Assessment of Integrated Assessments?

- Peer Reviewed Proposals
- Peer Reviewed Literature
- Forum Analysis
- Model Assessment Projects
- PCMDI-Like Institution
- Other

Thank You!

# Basic Strategies for Developing Models

- Identify All Potential Questions First, Then Design the Model to Help Address Them
- Develop a Flexible Modeling Architecture That Can Be Easily Adapted to New Problems
- Do Both!

# Model Development/Assessment Issues: Common Pitfalls in Policy Modeling

- Lack of Focus
  - Pick a basic model structure without a set of applications firmly in mind
  - Not modifying model in response to new problems
- Mistaking the Model for Reality
  - If its not in the model it probably doesn't exist
  - Test alternative assumptions only against the model
  - Methodological limitations imply real world restrictions
- Poor Communication of Results
  - Overstating strength of results
  - Omitting key relevant assumptions/qualifications

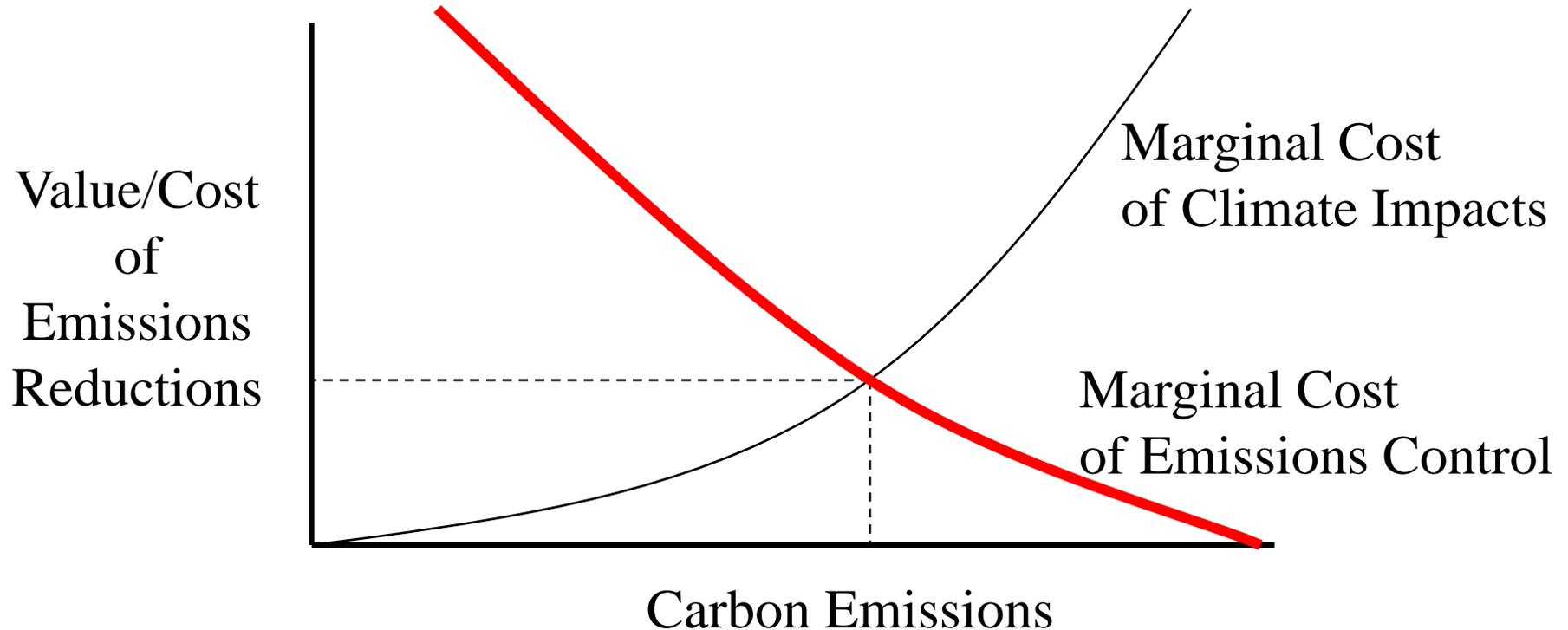
# Technology is King

**Table 1: Technology Assumptions**

Technology	units	1990 Base	Year 2100	
			Mini- CAM B2	Mini- CAM B2 AT
US Automobiles	mpg	18	60	100
Land-based Solar Electricity	1990 c/kWh	61	5.0	5.0
Nuclear Power	1990 c/kWh	5.8	5.7	5.7
Biomass Energy	1990\$/gj	\$7.70	\$6.30	\$4.00
Hydrogen Production (CH <sub>4</sub> feedstock)	1990\$/gj	\$6.00	\$6.00	\$4.00
Fuel Cell	mpg (equiv)	43	60	98
Fossil Fuel Power Plant Efficiency (Coal/Gas)	%	33	42/52	60/70
Capture Efficiency	%	90	90	90
Carbon Capture Power Penalty (Coal)	%	25	15	5
Carbon Capture Power Penalty (Gas)	%	13	10	3
Carbon Capture Capital Cost (Coal)	%	88	63	5
Carbon Capture Capital Cost (Gas)	%	89	72	3
Geologic Disposal (CO <sub>2</sub> )	\$/tC	37.0	37.0	23.0

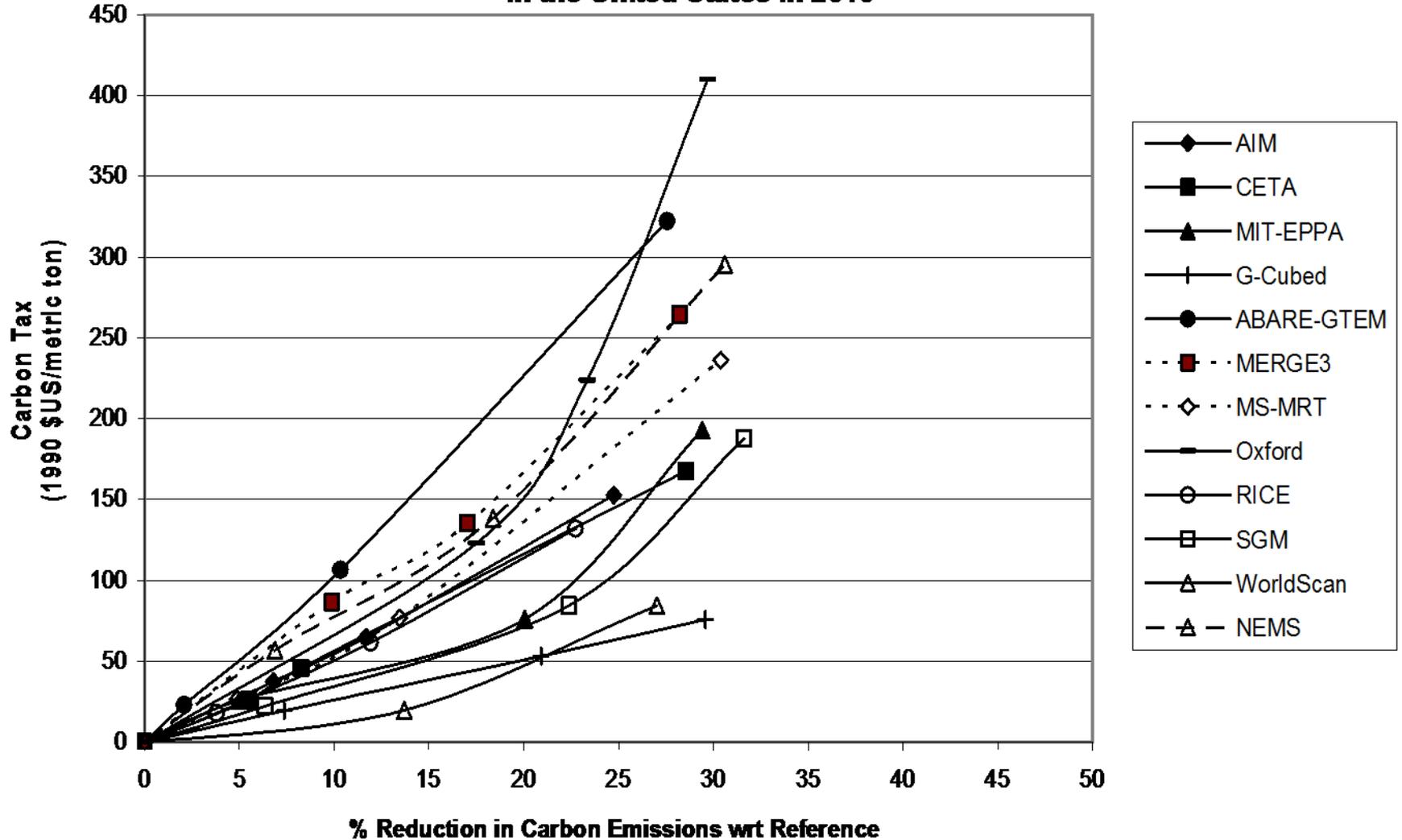
# Cost/Benefit Modeling Approach:

Balancing the Costs of Controlling Carbon Emissions  
Against the Costs of the Climate impacts They Cause



# The Substitution in the Models

**Marginal Cost of Carbon Emission Reductions  
in the United States in 2010**



# The Energy Resource Mix

World Primary Energy in 550 ppm Case in 2100

