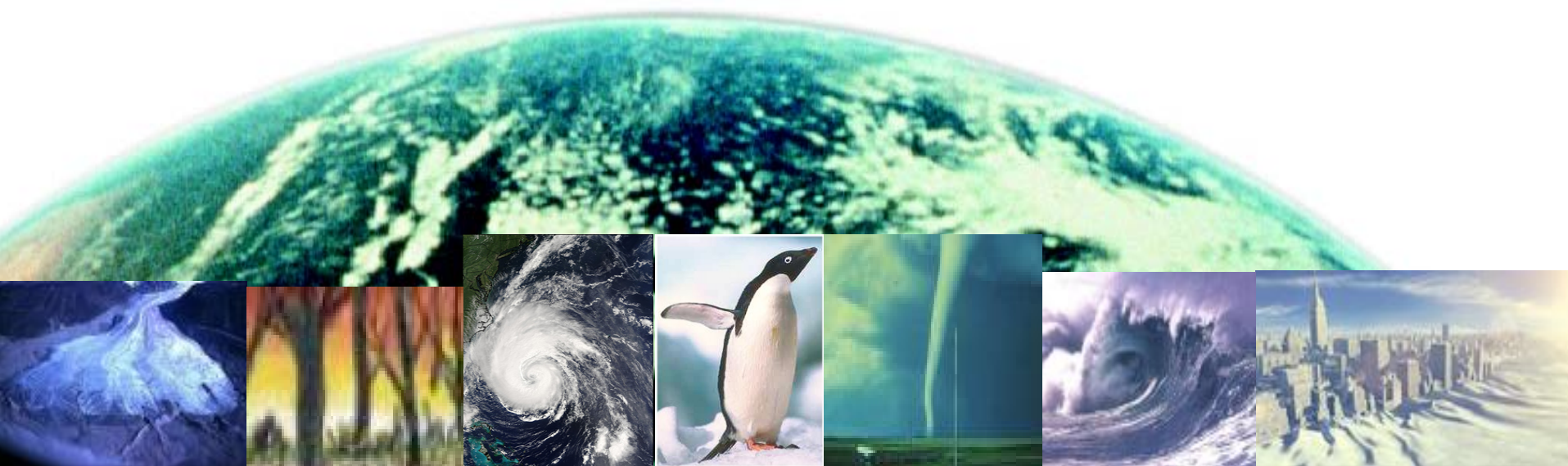


# Adaptive Decisionmaking and Cooperative Management of Uncertain Climate Change

**Jürgen Scheffran**  
University of Illinois at Urbana-Champaign

**Climate Decision Making Center**  
Carnegie Mellon University

November 8, 2006



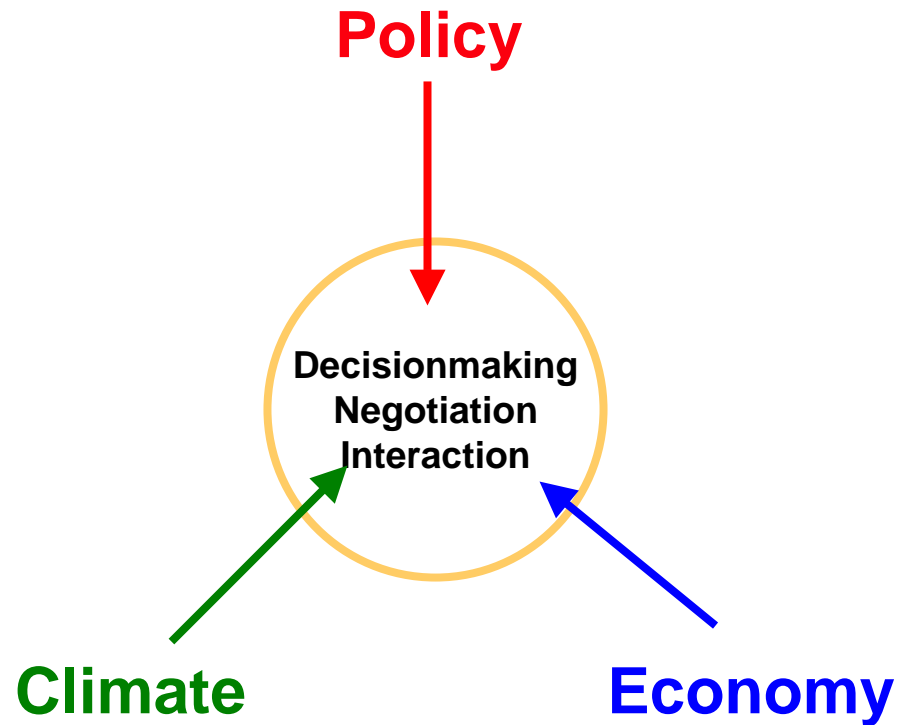
# Outline

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- 1. Integrated assessment and adaptive decision-making on energy and climate change**
- 2. Data, uncertainty and risk**
- 3. Adaptive strategies vs. optimal control**
- 4. Interactive decision-making, cooperation and coalition formation among multiple actors**
- 5. Summary and outlook**

# Integrated Approach

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# UN Framework Convention on Climate Change

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## UNFCCC Article 2 ultimate objective (Rio 1992):

“**stabilization** of greenhouse gas concentrations in the atmosphere at a level that would **prevent dangerous anthropogenic interference** with the climate system.

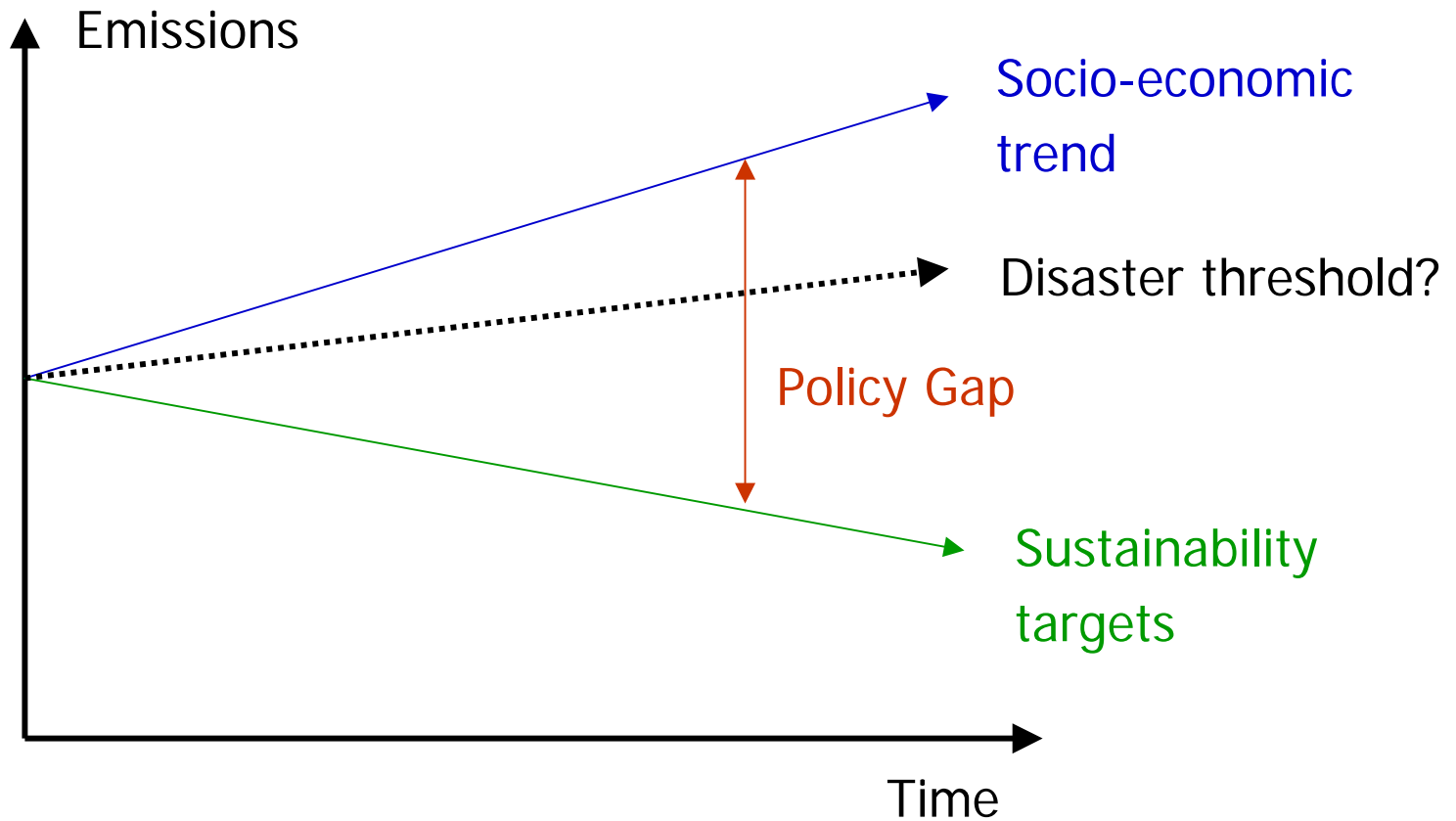
Such a level should be achieved within a **time-frame** sufficient

- to allow **ecosystems to adapt** naturally to climate change,
- to ensure that **food production is not threatened** and
- to enable **economic development to proceed in a sustainable manner.**”

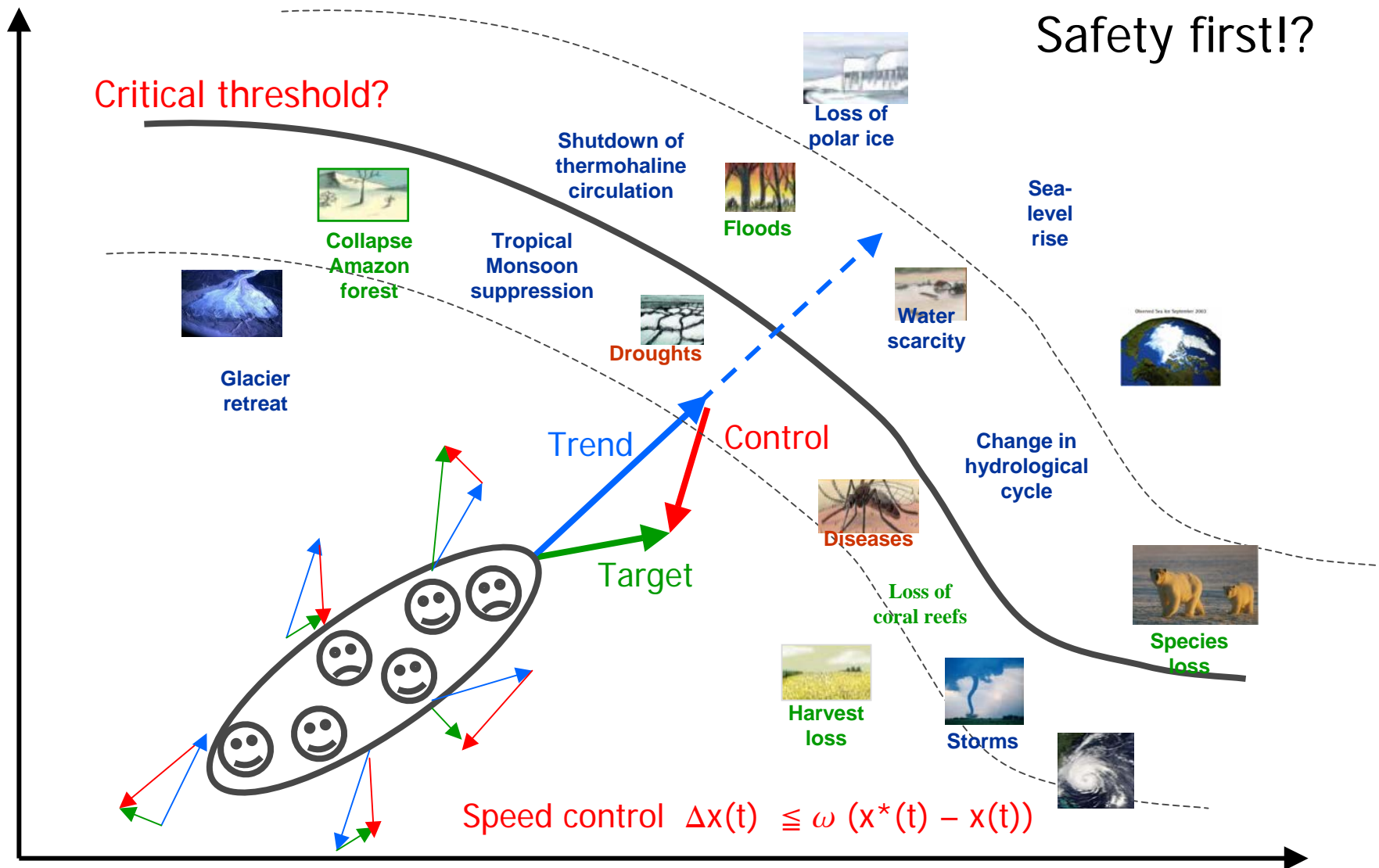
## 1997 Kyoto Protocol to the UNFCCC:

- Greenhouse gas (GHG) emission reductions for industrialised countries: average **-5.2% of 1990 level until 2008-2012**
- In force since **February 16, 2005**

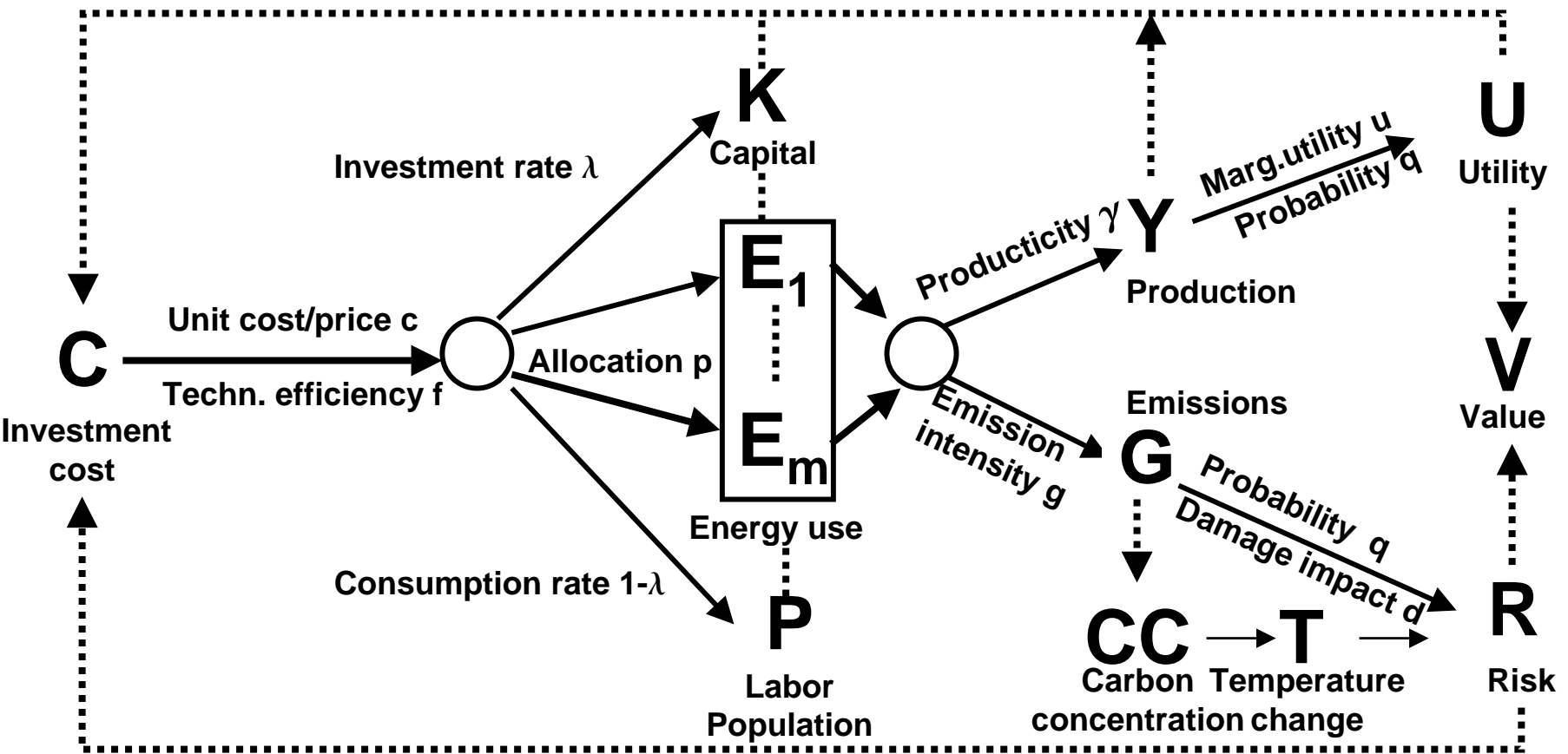
# The Gap between Trends and Targets



# Adaptive Control: Where to Go and How Fast?



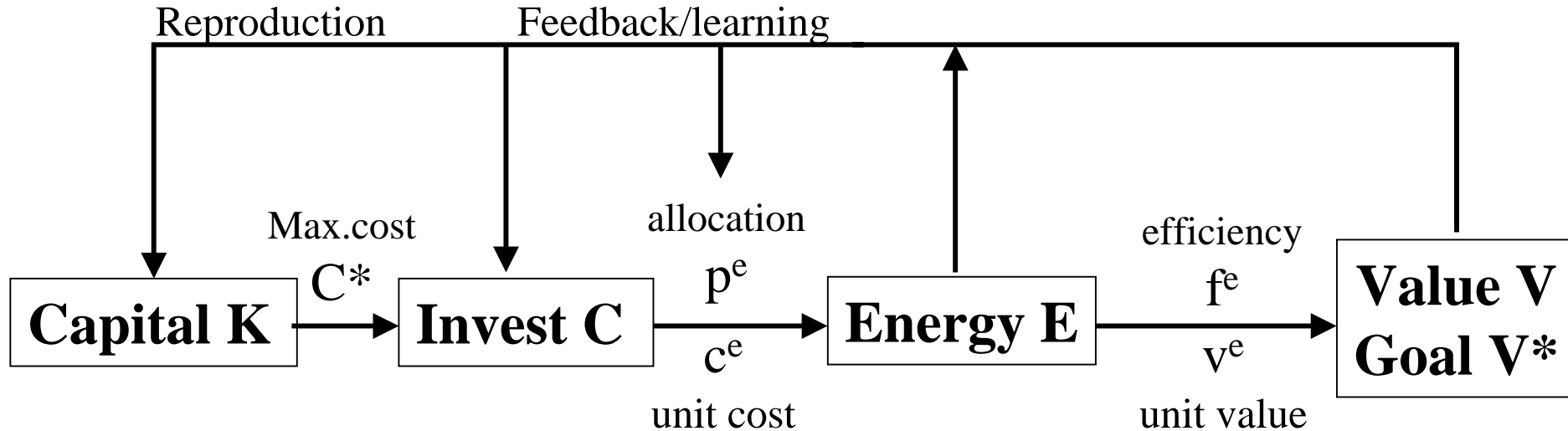
# Integrated Decision-making on Energy Options



$$U(E) = q f \gamma p C(E) / c$$

$$R(E) = q (D/G) (G/E) (E/Y) (Y/P) P = q d g e y P$$

# The Single Actor Feedback Loop



$$\Delta V = v^e \Delta E = f^e C$$

$$\Delta C = -k C (C^* - C) (V - V^* + \tau \Delta V)$$

Logistic budget restraint

Value driver

$C$  : Cost invested in a given period (flow variable) for changing system state  $x$  with  $0 \leq C \leq C^*$

$f^x = p^x v^x / c^x$  action efficiency, depending on unit cost  $c^x$ , unit value  $v^x$  and

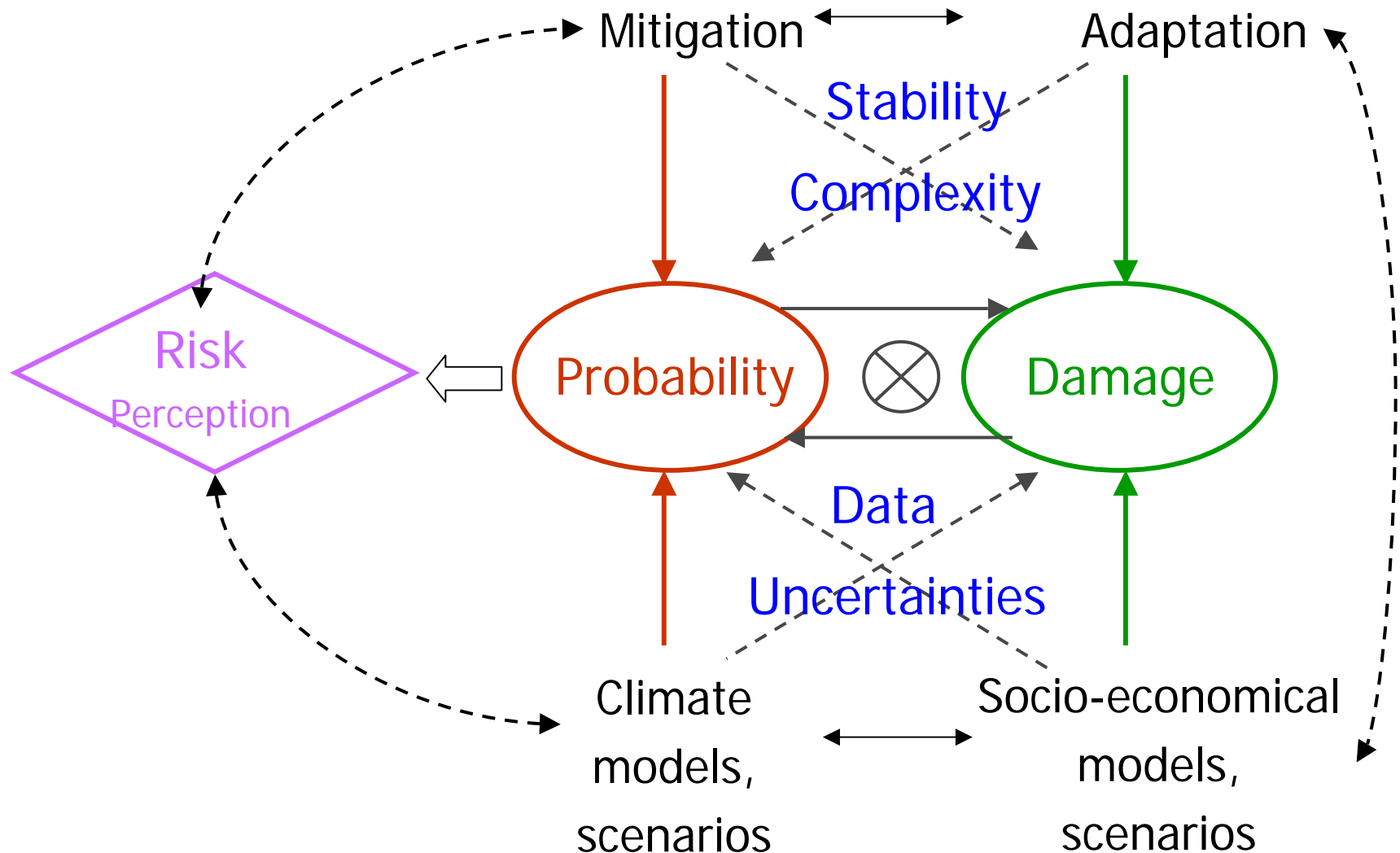
$p^x$  : percentage of cost allocated to action path  $x$ .

$k$  cost reactivity in logistic reaction function

$\tau$  desired decay time of value gap



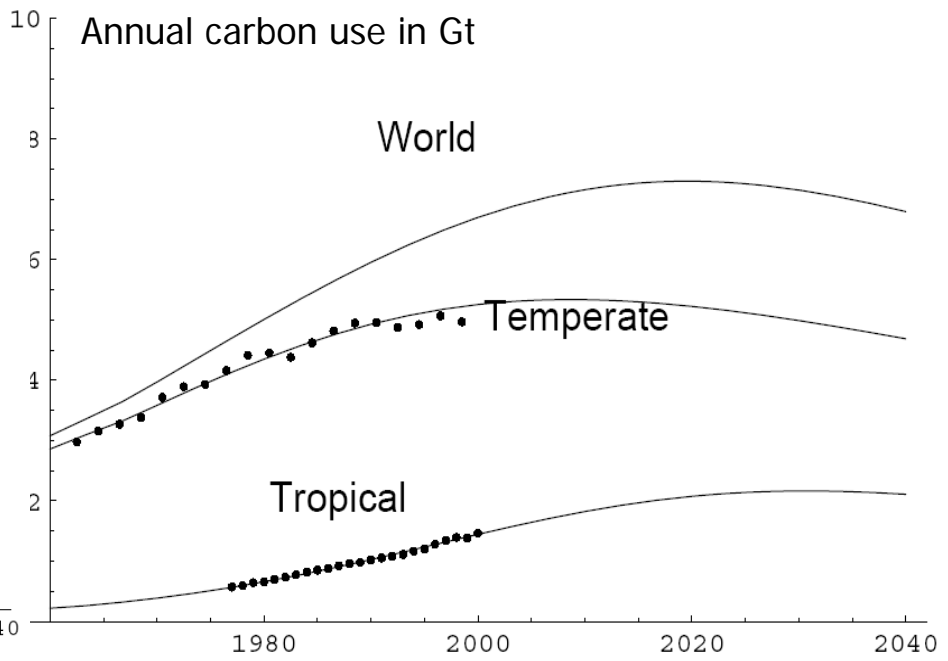
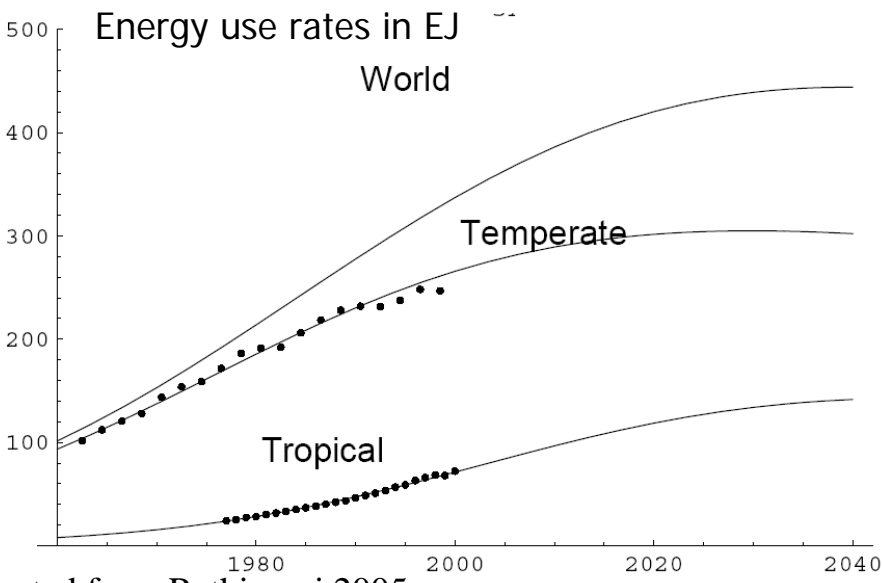
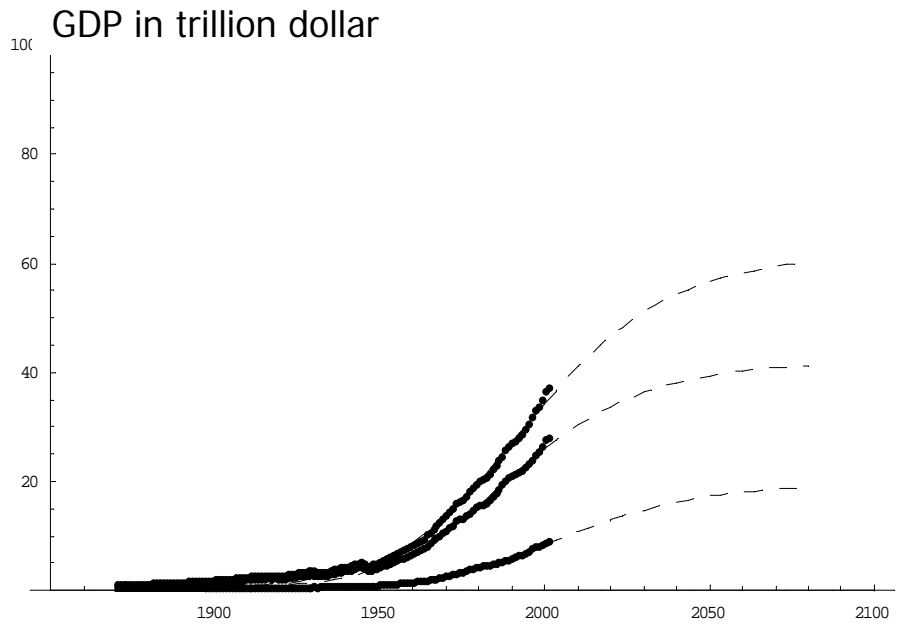
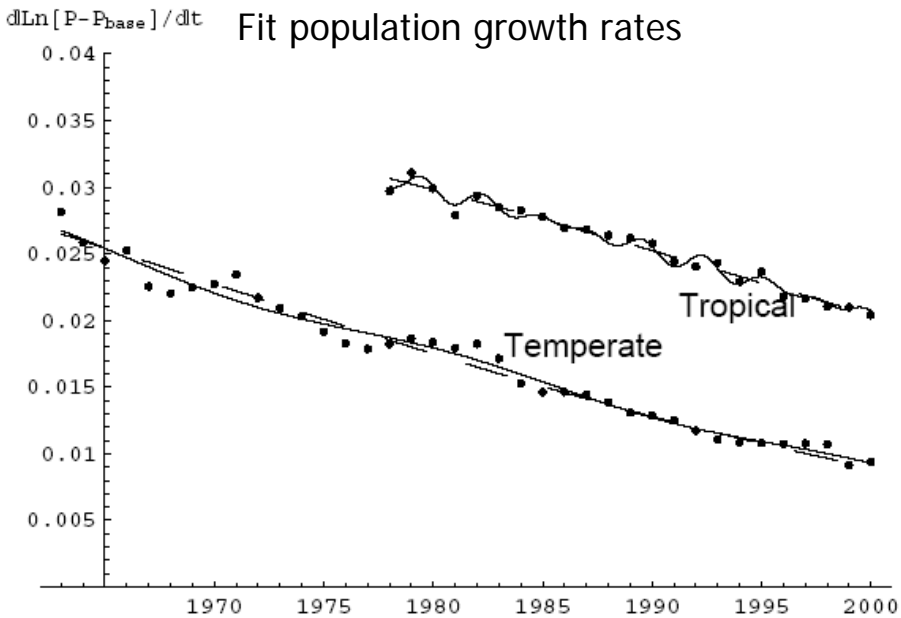
# Factors of Climate Risk Assessment



# Data-calibrated Econometric Model with Basic Climate Model

- Optimization of time-integrated discounted utility of per capita consumption using log-linear production functions in capital, labor, energy, and development with constant returns to scale.
- Energy production is log-linear in labor, capital, and development. Energy production, total capital and population are measured in units of their steady-state limits.
- Development index grows logistically with time in proportion to population and is the ratio of total labor to its steady-state limit. Population growth rates are used to calibrate the development index.
- Production efficiency decreases linearly with decreasing carbon intensity of energy production, which is data calibrated for the past and determined by theories of fuel source substitution and international cooperation on emissions limitations for more distant future.
- Country data and simulation results are clustered into different regional aggregations (tropical region within forty degrees north and south and temperate region).

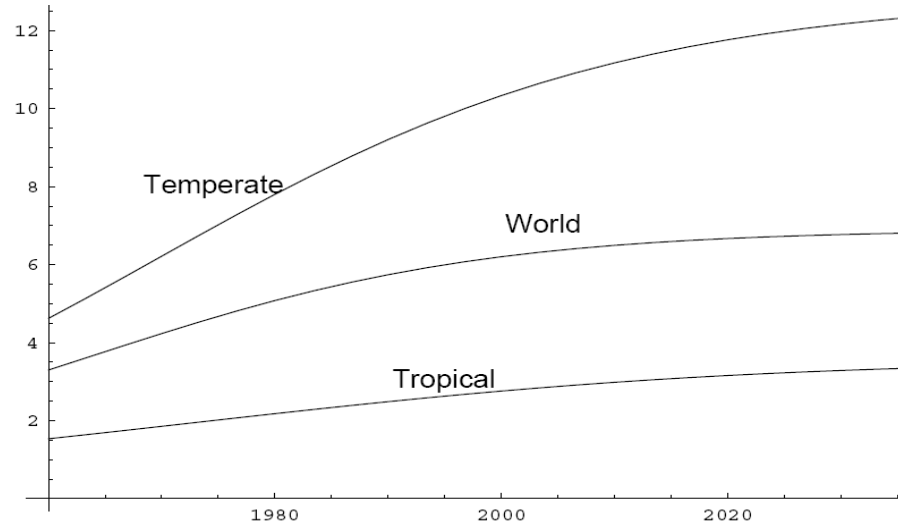
# Data and Projections for Population, GDP, Energy, Carbon



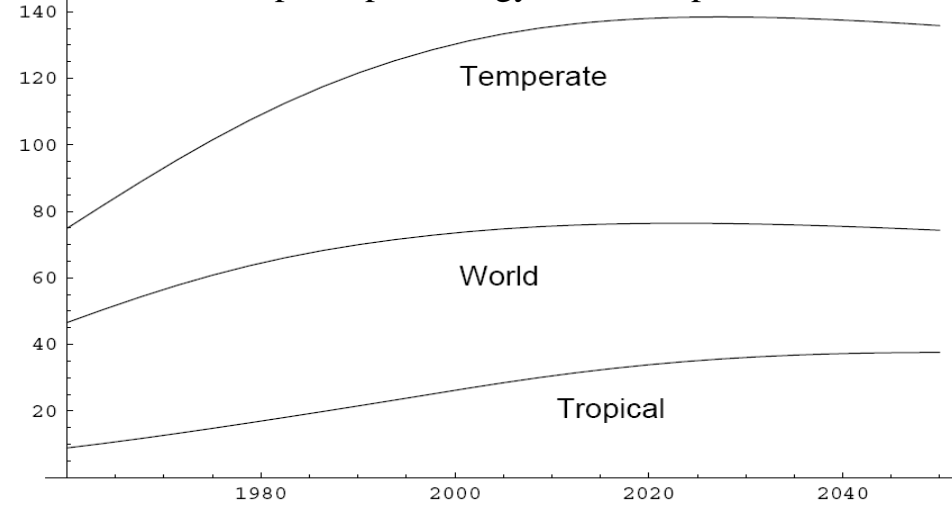
# Relevant Factors

Rethinaraj 2005

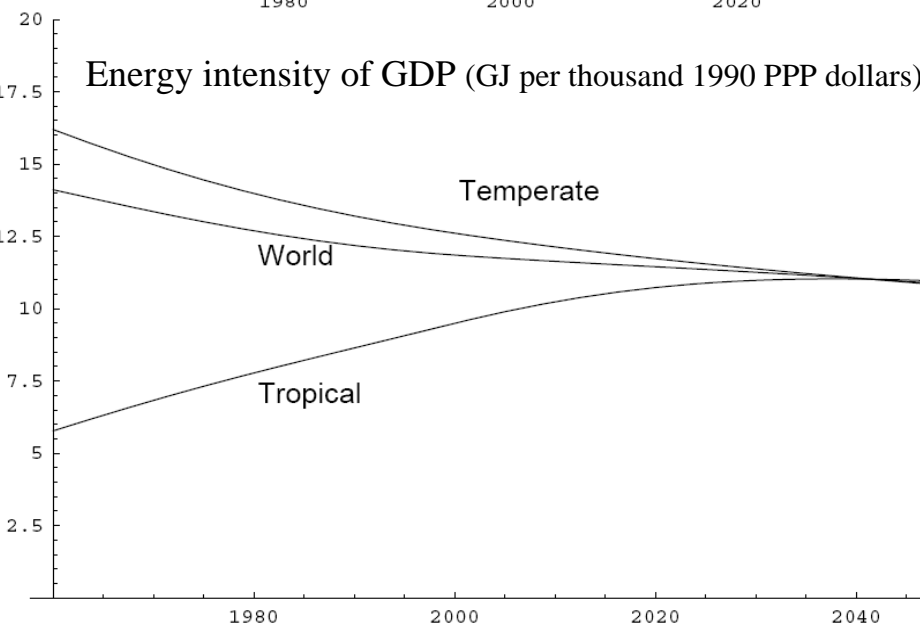
Annual GDP per capita in thousand 1990 dollars/person



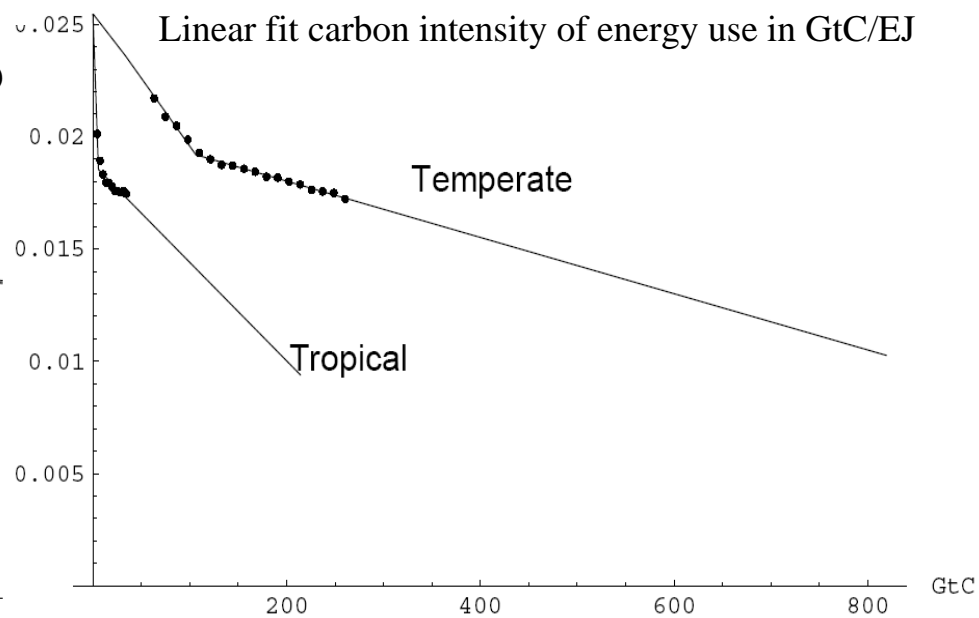
Annual per capita energy use in GJ/person



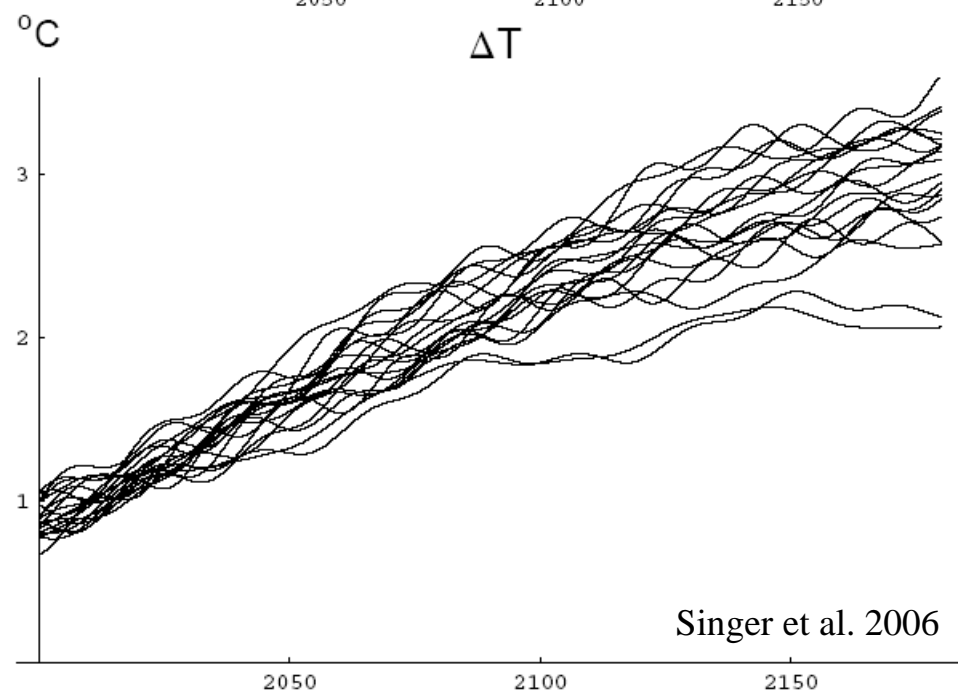
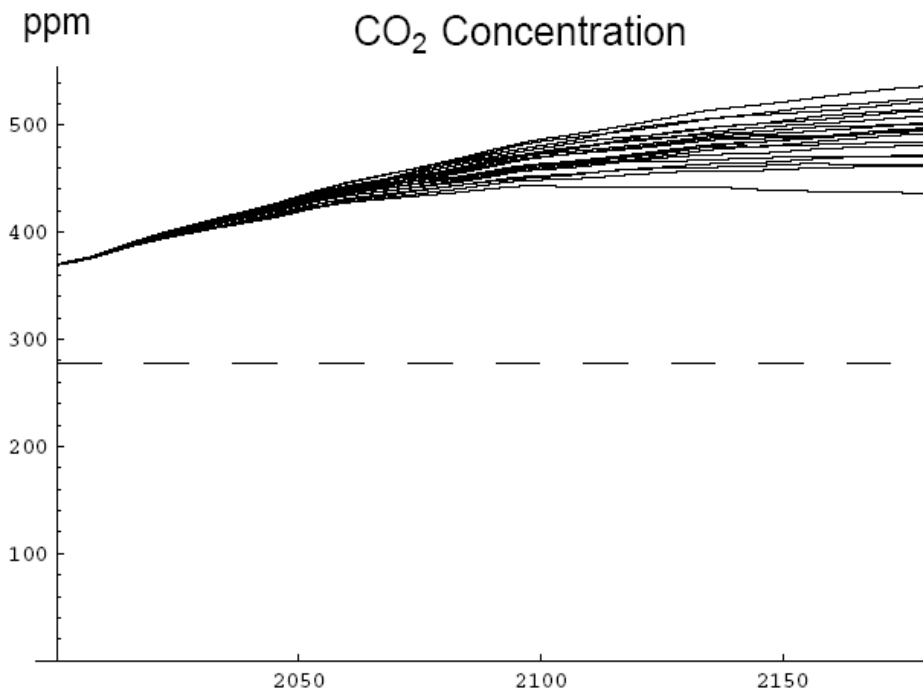
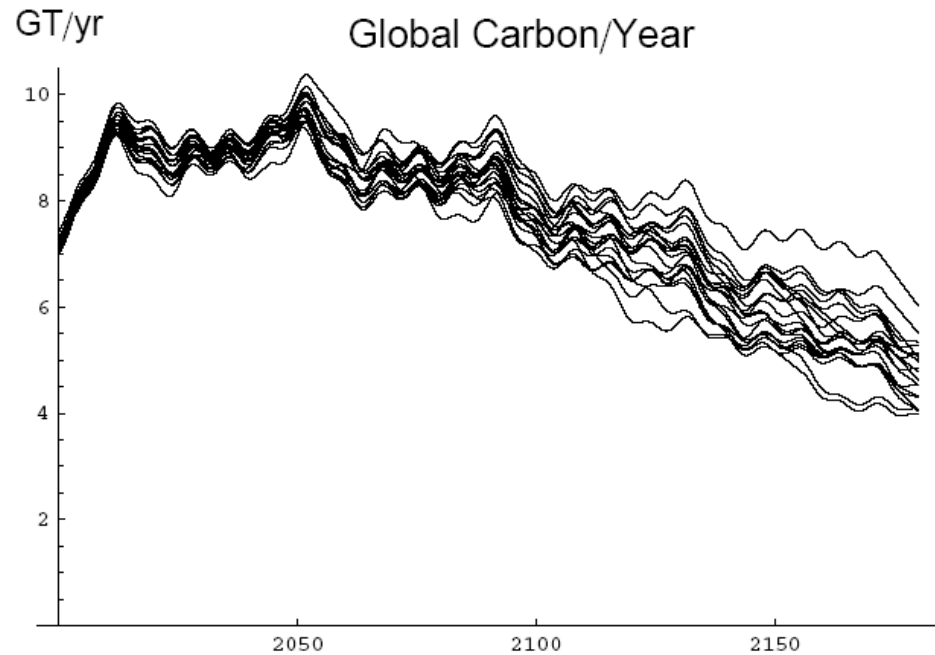
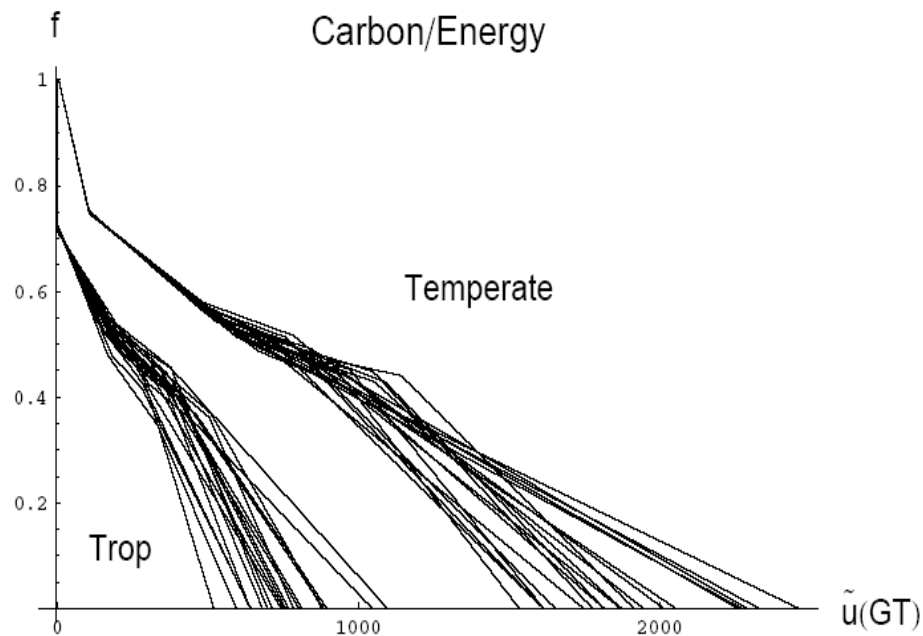
Energy intensity of GDP (GJ per thousand 1990 PPP dollars)



Linear fit carbon intensity of energy use in GtC/EJ

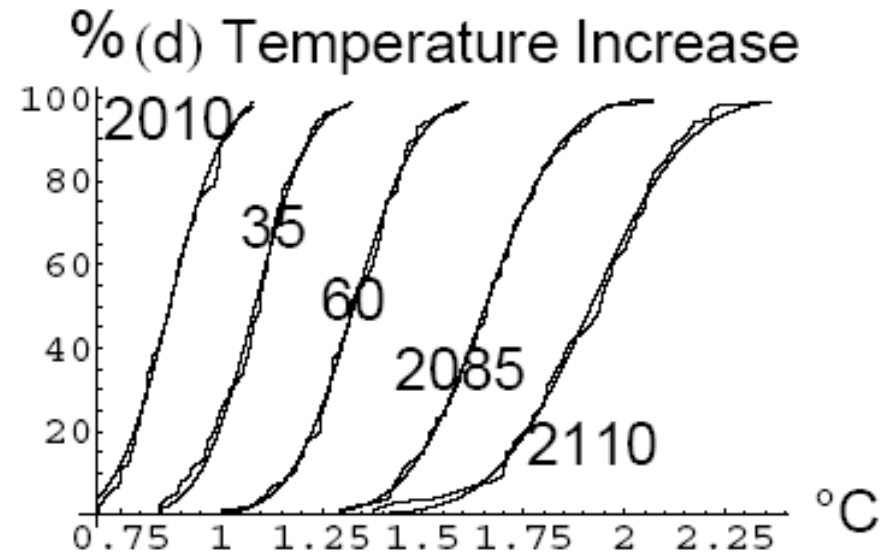
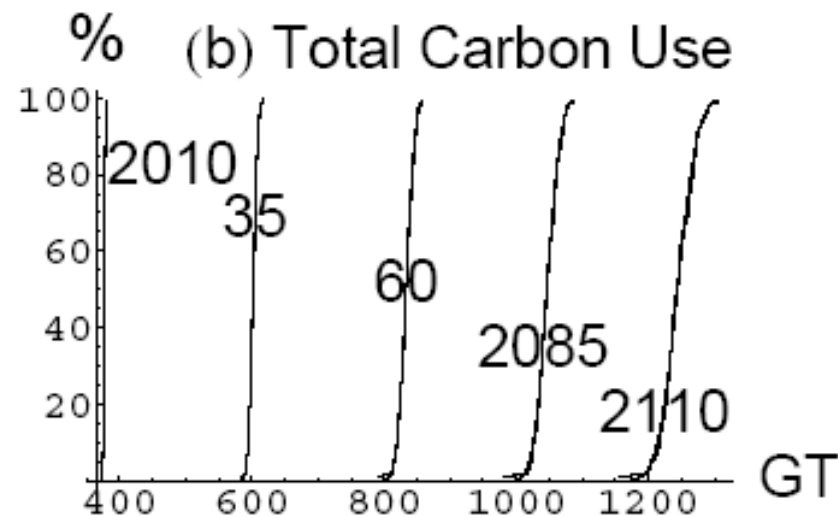
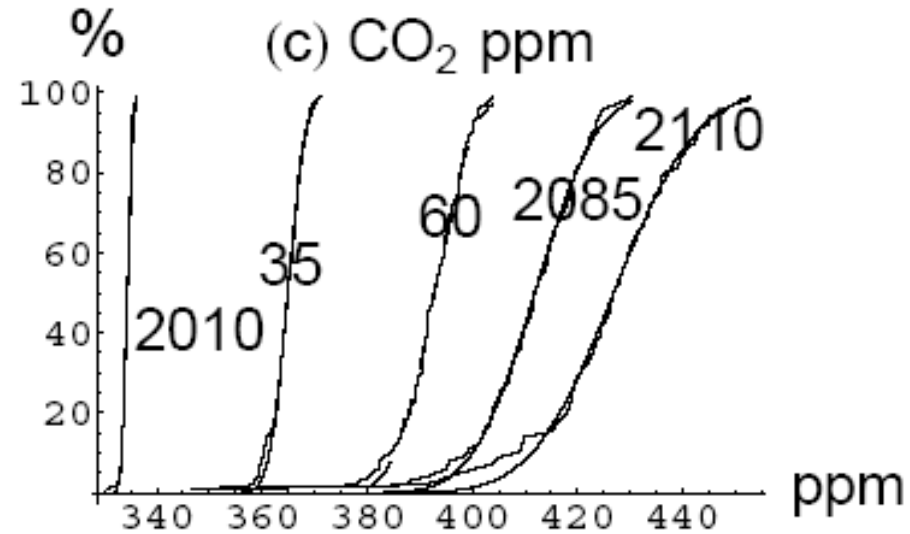
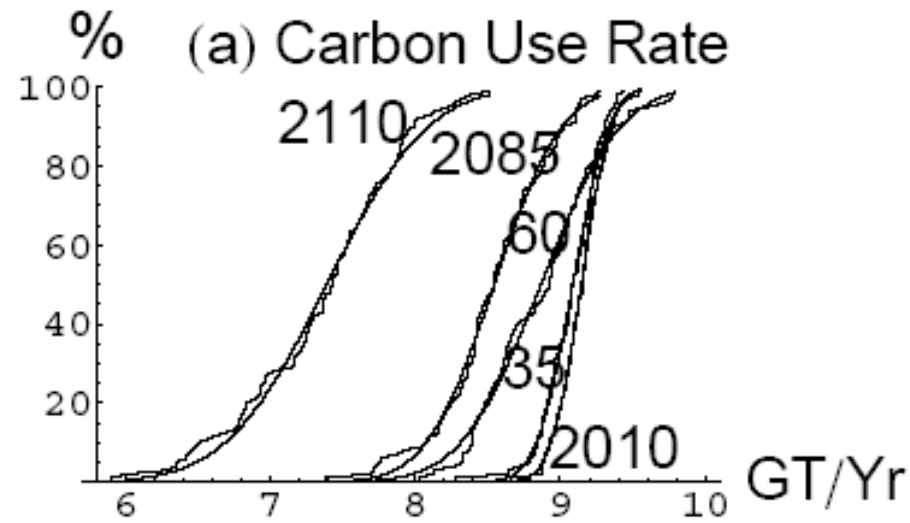


# Randomly Sampled Climate Variables

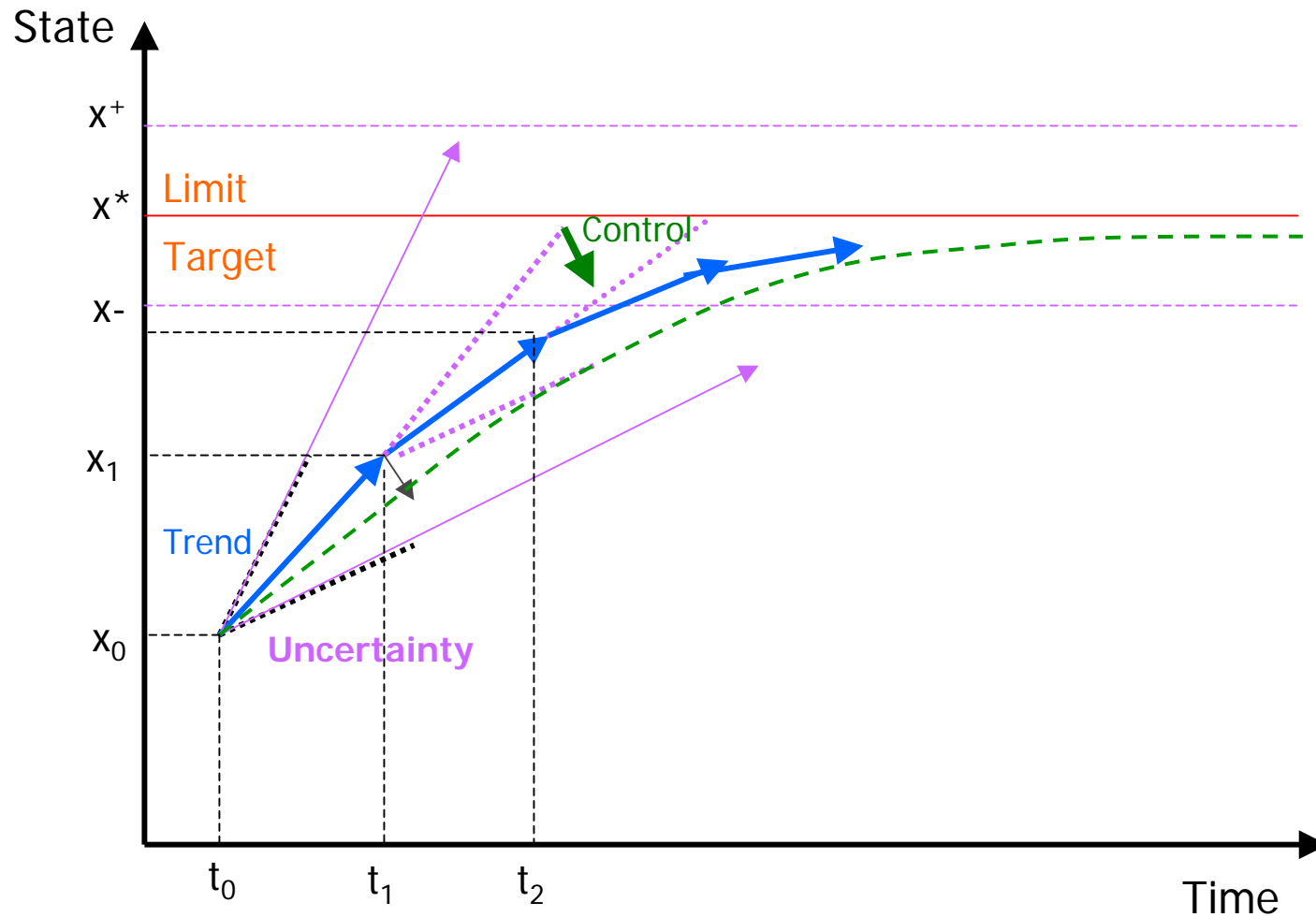


# Cumulative Probability Distributions

Cumulative probability distribution centiles (jagged plots), and cumulative normal distributions fit to central 95 centiles (smooth curves) for indicated years (Singer et al. 2006)



# Adaptive Control Under Uncertainty



Adaptive decision rules:  $\Delta x(t) = w(x,t) D(x,t)$

Speed control  $\Delta x(t) \leq w (x^*(t) - x(t))$

# Optimal and adaptive control

**Optimal control approach:** Control dynamic system (for some initial and terminal conditions)

$$\dot{x} = f(x, u)$$

with state variables  $x(t) \in X(t)$  and control variables  $u(t) \in U(t)$  to maximize time discounted value:

$$\text{Max}_{u \in U} \int_0^T V(x(t), u(t)) e^{-\rho t} dt$$

**Viable control approach (target setting):** Control dynamic system

$$\dot{x} = f(x, u)$$

to realize given target path  $x^*(t)$  or dynamic system  $\dot{x} = g(x, t)$  by choice of  $u(t) \in U$ . Then

$$\ddot{x} = \frac{\partial f}{\partial x} \dot{x} + \frac{\partial f}{\partial u} \dot{u} = \frac{\partial g}{\partial x} \dot{x}$$

With  $\dot{x} = g(x)$  and  $f_x, f_u, g_u$  for partial derivatives, required control is

$$\dot{u} = \frac{g_x - f_x}{f_u} g(x)$$



# The Basic Climate Model

$$\Delta F = G$$

$$\Delta C = B F + \beta G - \sigma C$$

$$\Delta T = \mu \ln(1 + C / C_1) - \alpha T$$

**Greenhouse gas emissions  $G$**

**Cumulative emissions  $F$**

**Atmospheric concentrations  $C$**

**Global mean temperature  $T$**

$C_1 = 280$  ppmv and  $T_1 = 14.6$  °C denote preindustrial levels

$$\mu = Q_{2C} / (c_{oc} \ln 2), \quad \alpha = Q_{2C} / (c_{oc} T_{2C})$$

$Q_{2C} = 3.7$  W m<sup>-2</sup> radiative forcing for doubling concentration

$c_{oc} = 61.4$  Wa m<sup>-2</sup> °C<sup>-1</sup> : effective ocean heat capacity

$T_{2C} \in [1.5^\circ\text{C}, 4.5^\circ\text{C}]$  climate sensitivity (double concentration)

Parameter	Value	Initial condition	Value
$B$	$1.51 \cdot 10^{-3}$ ppm/(Gt C · a)	$G_0$	7.9 Gt C/a
$\beta$	0.47 ppm/(Gt C)	$F_0$	426 Gt C
$\sigma$	$2.15 \cdot 10^{-2}$ 1/a	$C_0$	360 ppm
$\mu$	$8.7 \cdot 10^{-2}$ °C/a	$T_0$	15.3 °C
$\alpha$	$1.7 \cdot 10^{-2}$ 1/a		

# Temperature Limits and Admissible Emission Paths for CO2 Stabilization

Stabilize atmospheric carbon at limit  $C^*$  with function  $h(C) = \omega(C^* - C)$

$$\dot{C} = BF + \beta G - \sigma C = \omega(C^* - C) = h(C).$$

Carbon limit is function of equilibrium temperature  $T^*$  and climate sensitivity  $T_{2C}$

$$C^* = C_1(2^\Theta - 1)$$

where  $\Theta = T^*/T_{2C}$

**Enforced concentration path:**

$$C(t) = C^0 + (C^* - C^0)(1 - e^{-\omega t})$$

**Constraint on emission change**

$$\beta \dot{G} = -BG + \omega(\sigma - \omega)(C^* - C^0)e^{-\omega t}$$

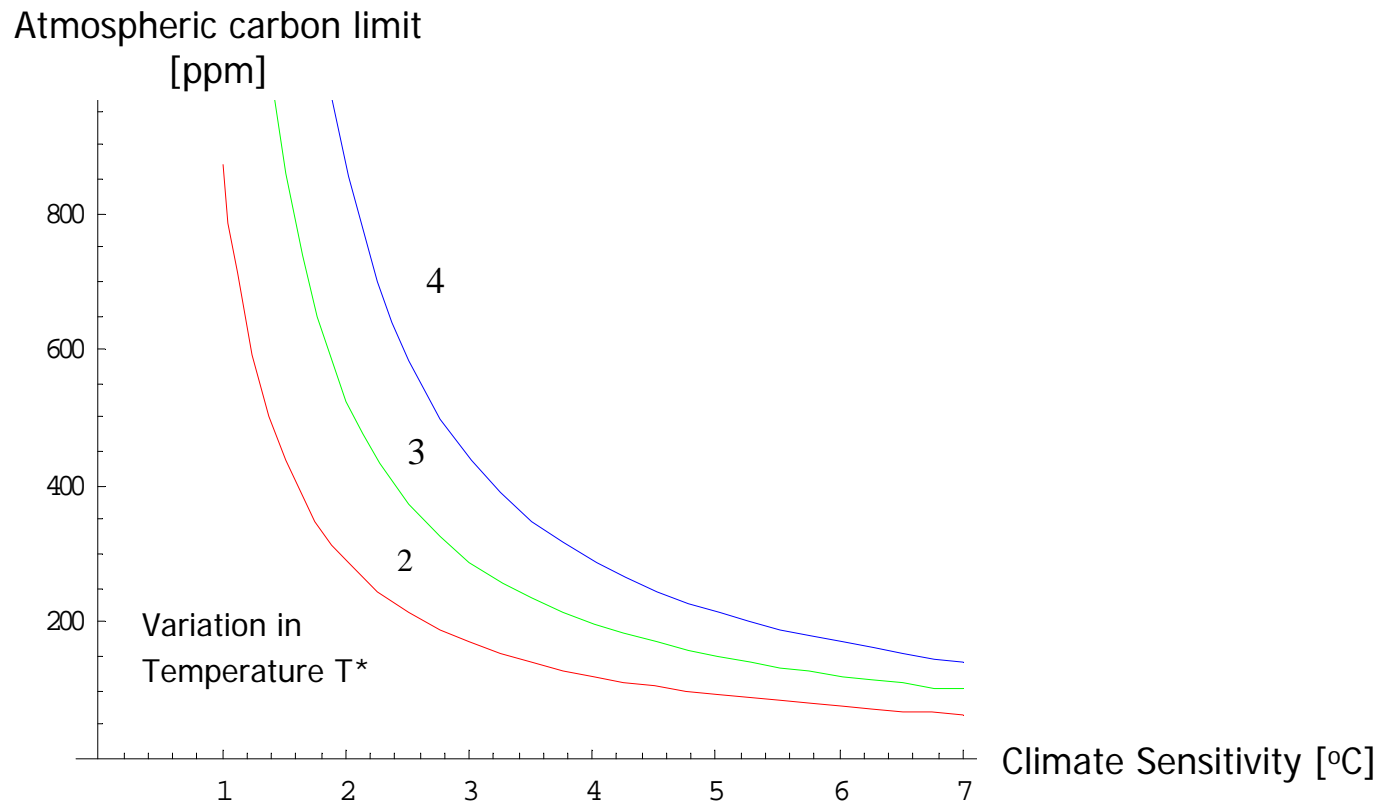
**Controlled emissions path**

$$G(t) = G^0 e^{-bt} + \bar{G}(e^{-bt} - e^{-\omega t})$$

$$b = B/\beta \quad \bar{G} = \frac{\omega(\sigma - \omega)(C^* - C^0)}{\beta\omega - B}.$$

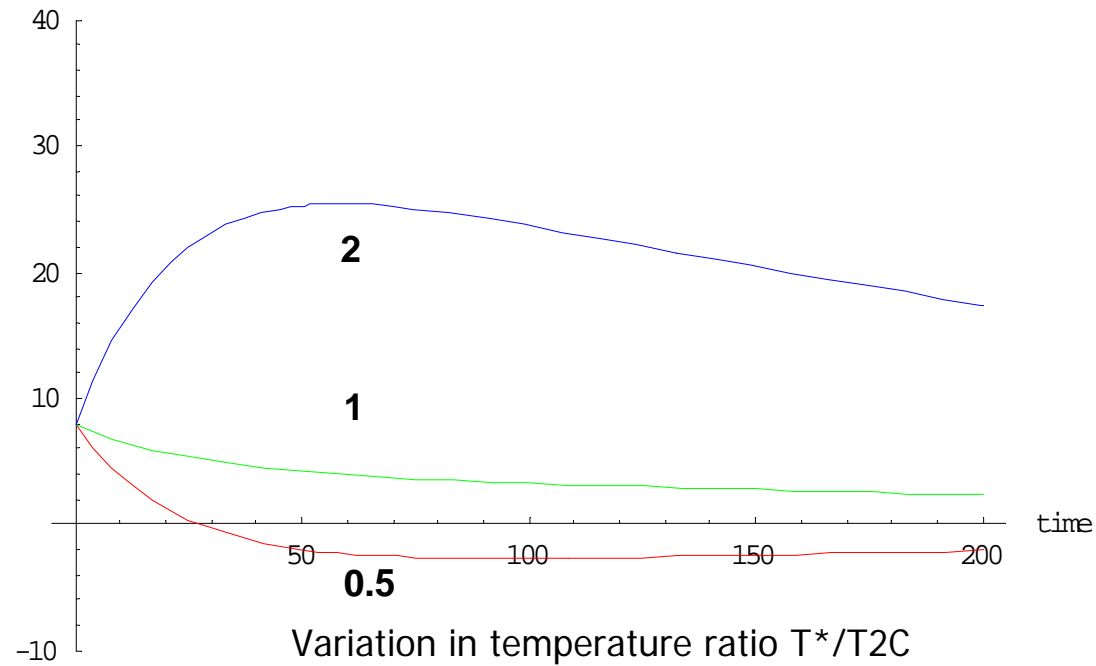
# Carbon and Temperature Limits and Climate Sensitivity

Temperature limit  $\Delta T(t) \leq w (T^*(t^*) - T(t))$  ,  $T(t) = T^* - (T^* - T^0) e^{-wt}$



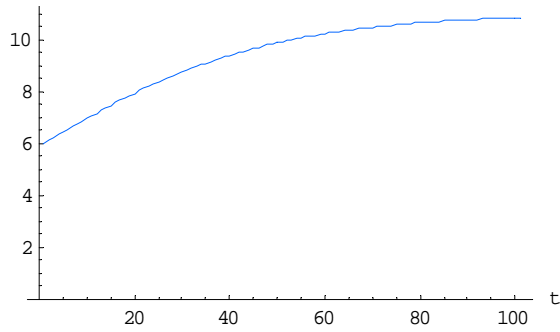
# Admissible Emission Range for Variation of Temperature Limits

Admissible emission rate in GtC/yr

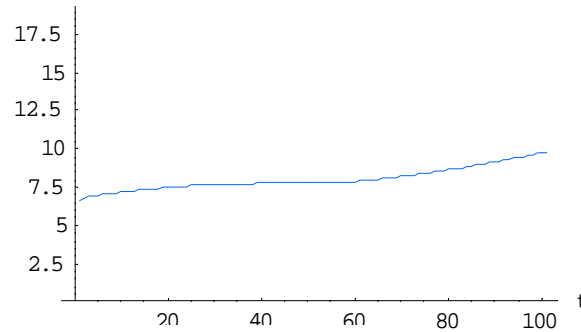


# Technical Change and Climate Damage

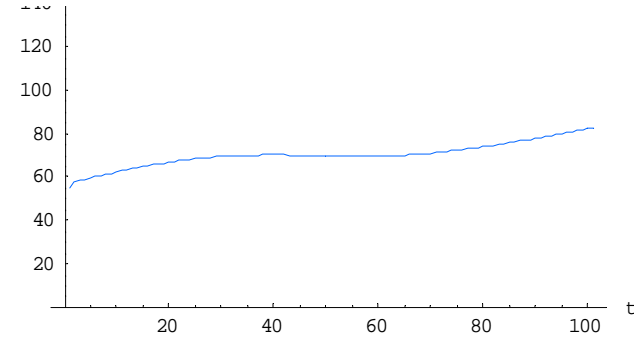
Population in bio.



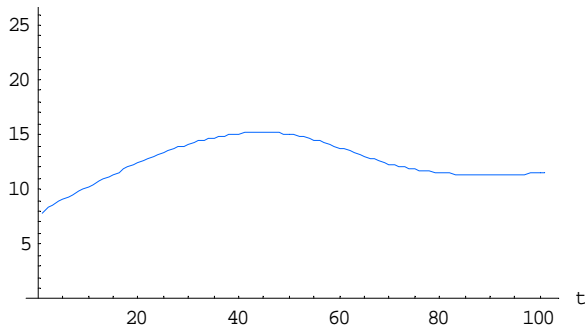
Production/capita in \$10,000



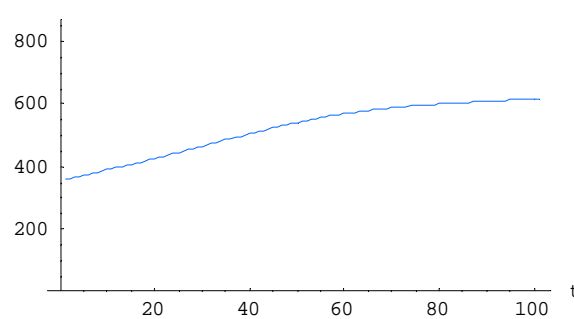
Energy/capita in GJ



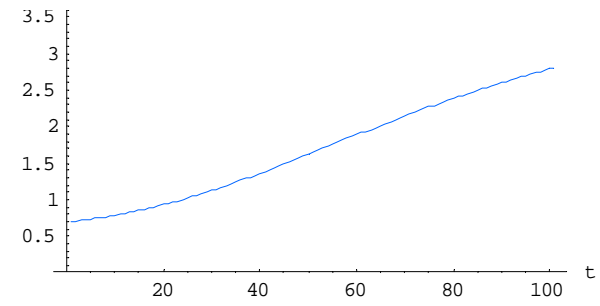
Emissions in GtC/a



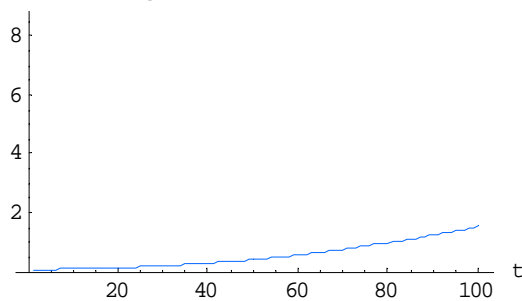
Atmospheric carbon in ppm



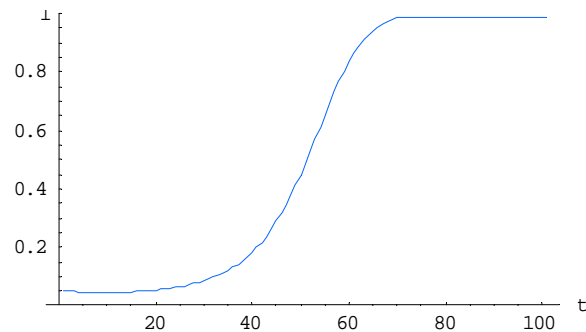
Temperature change in °C



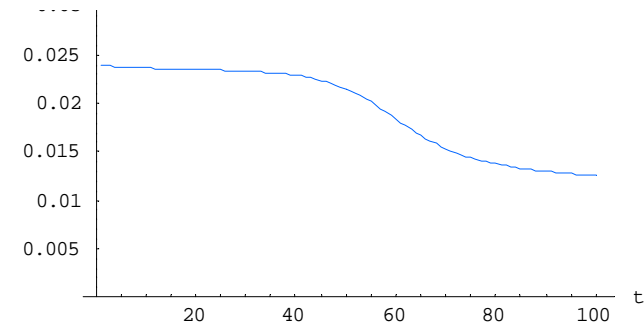
Climate damage/capita in \$10,000



Allocation to low-emission energy

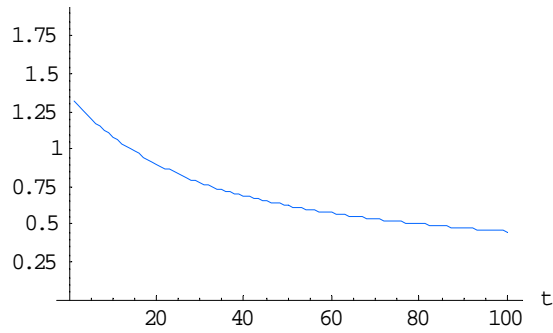


Carbon intensity of energy in GtC/EJ

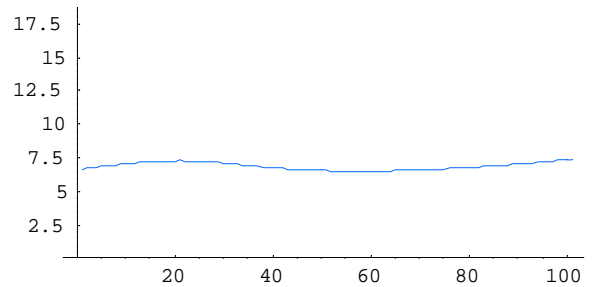


# Technical Change and Adaptive Control

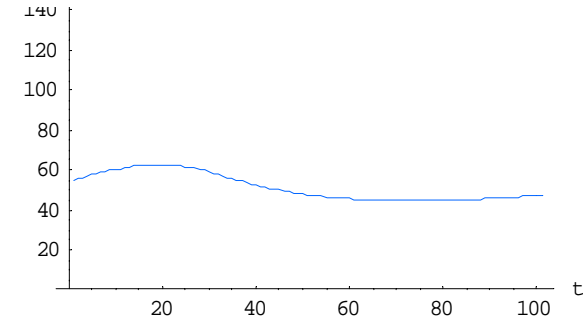
Emissions/capita in tC/cap



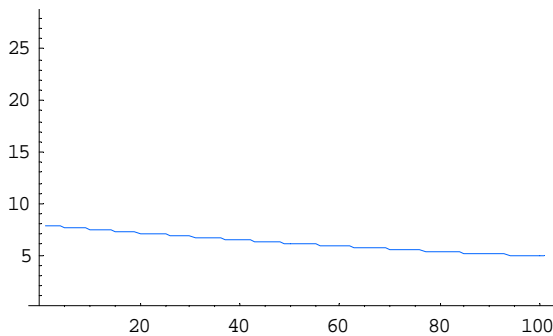
Production/capita in \$10,000



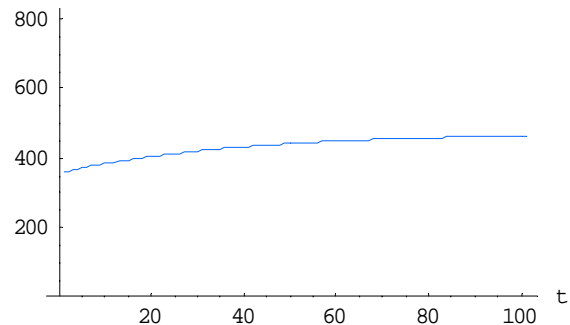
Energy/capita in GJ



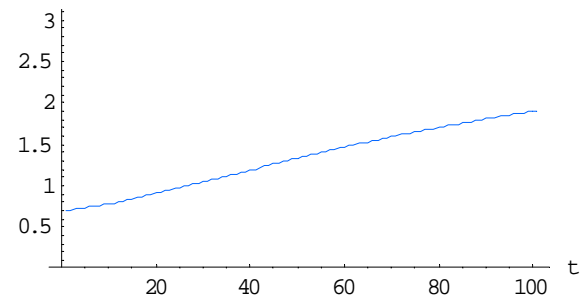
Emissions in GtC/a



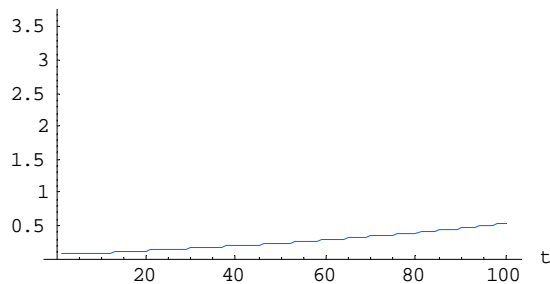
Atmospheric carbon in ppm



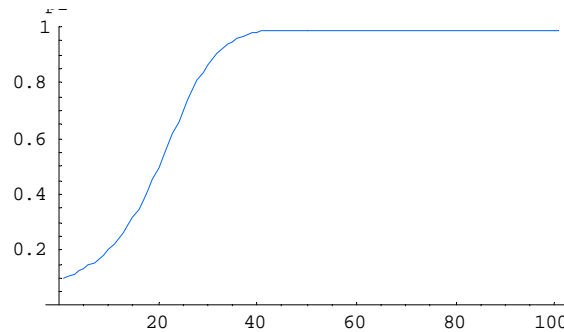
Temperature change in °C



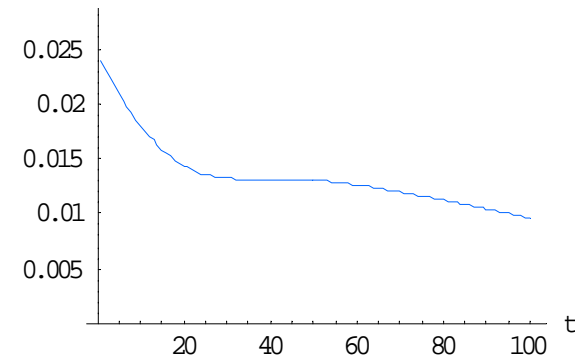
Climate damage/capita in \$10,000



Allocation to low-emission energy

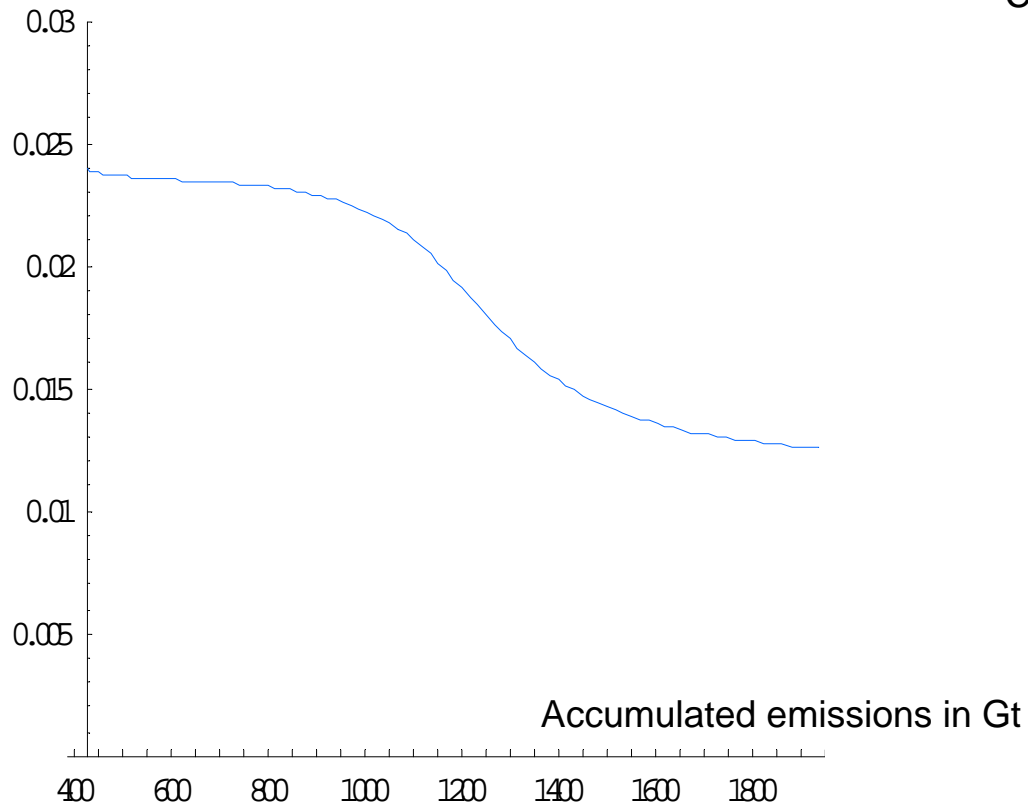


Carbon intensity of energy in GtC/EJ



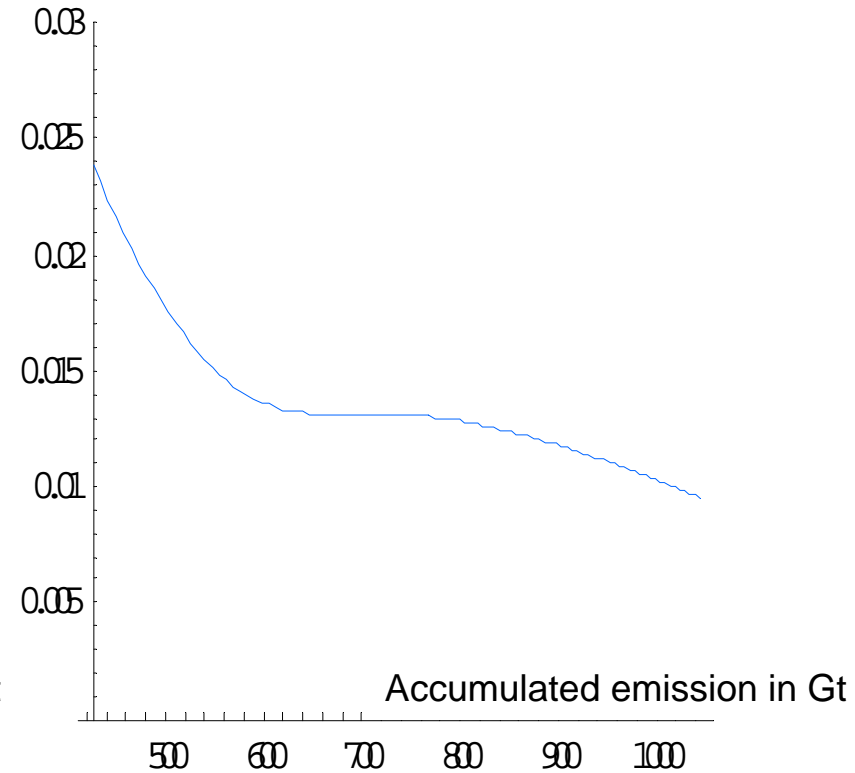
# Carbon Intensity vs. Accumulated Emissions

Carbon intensity of energy in GtC/EJ



Climate damage optimal control

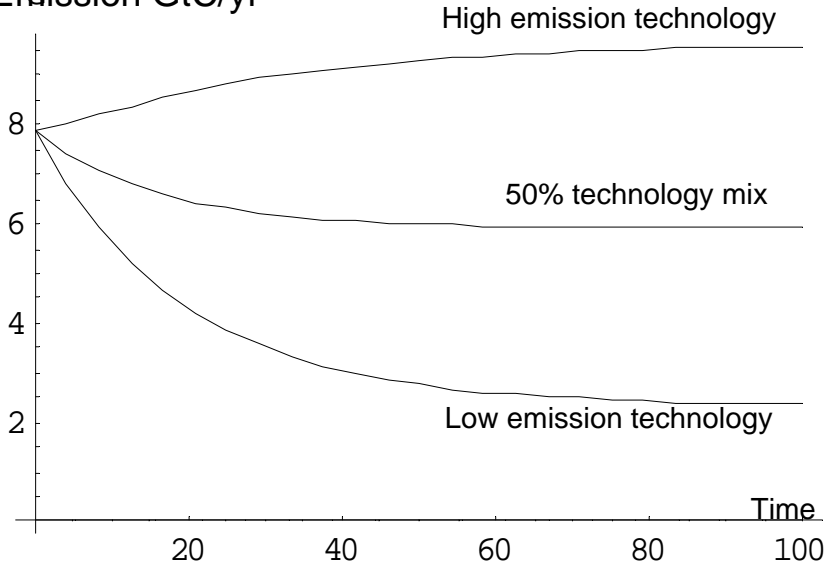
Carbon intensity of energy in GtC/EJ



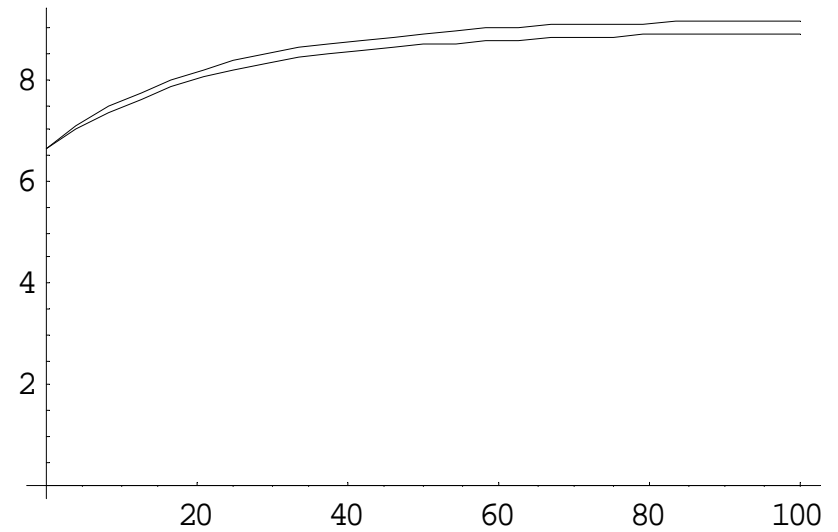
Adaptive control

# Comparison of Technology Paths

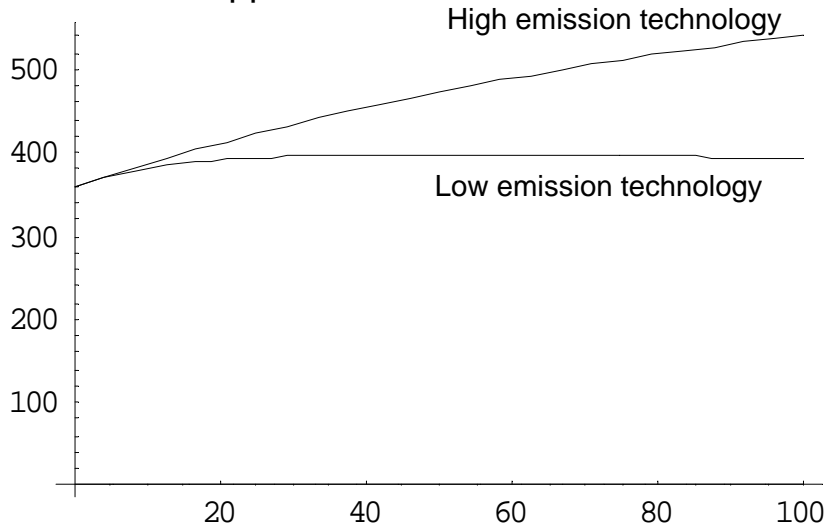
Emission GtC/yr



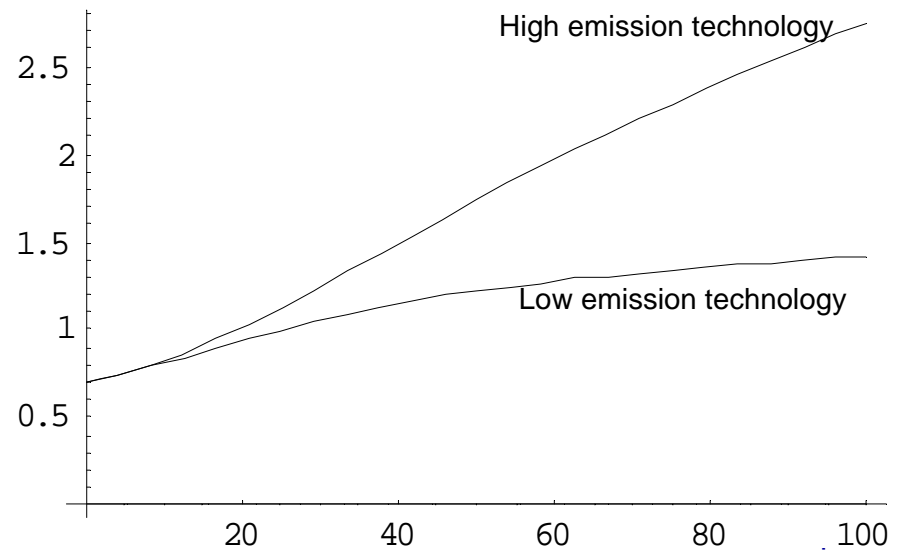
Per capita production \$10000/yr



Concentration ppm



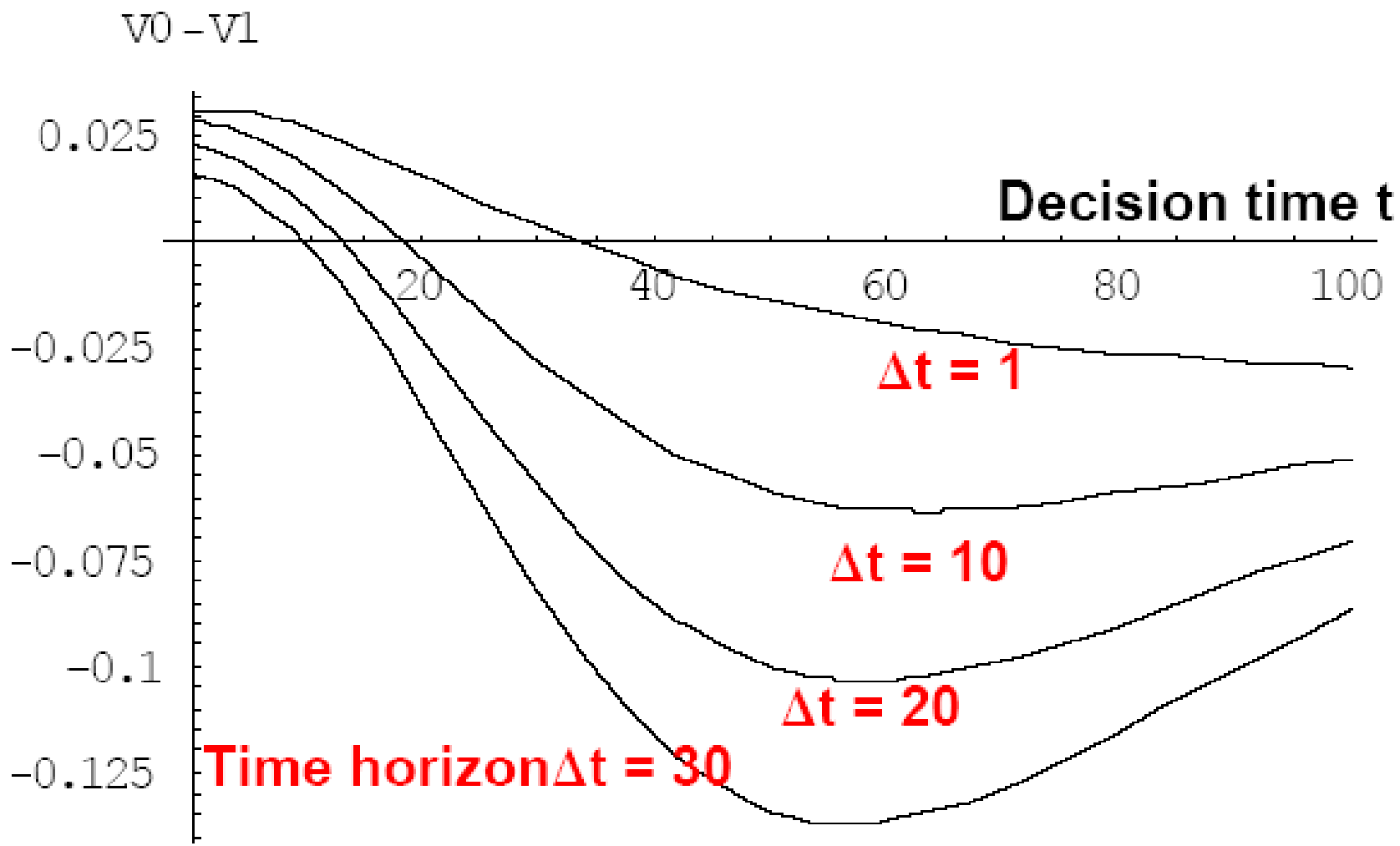
Temperature change °C





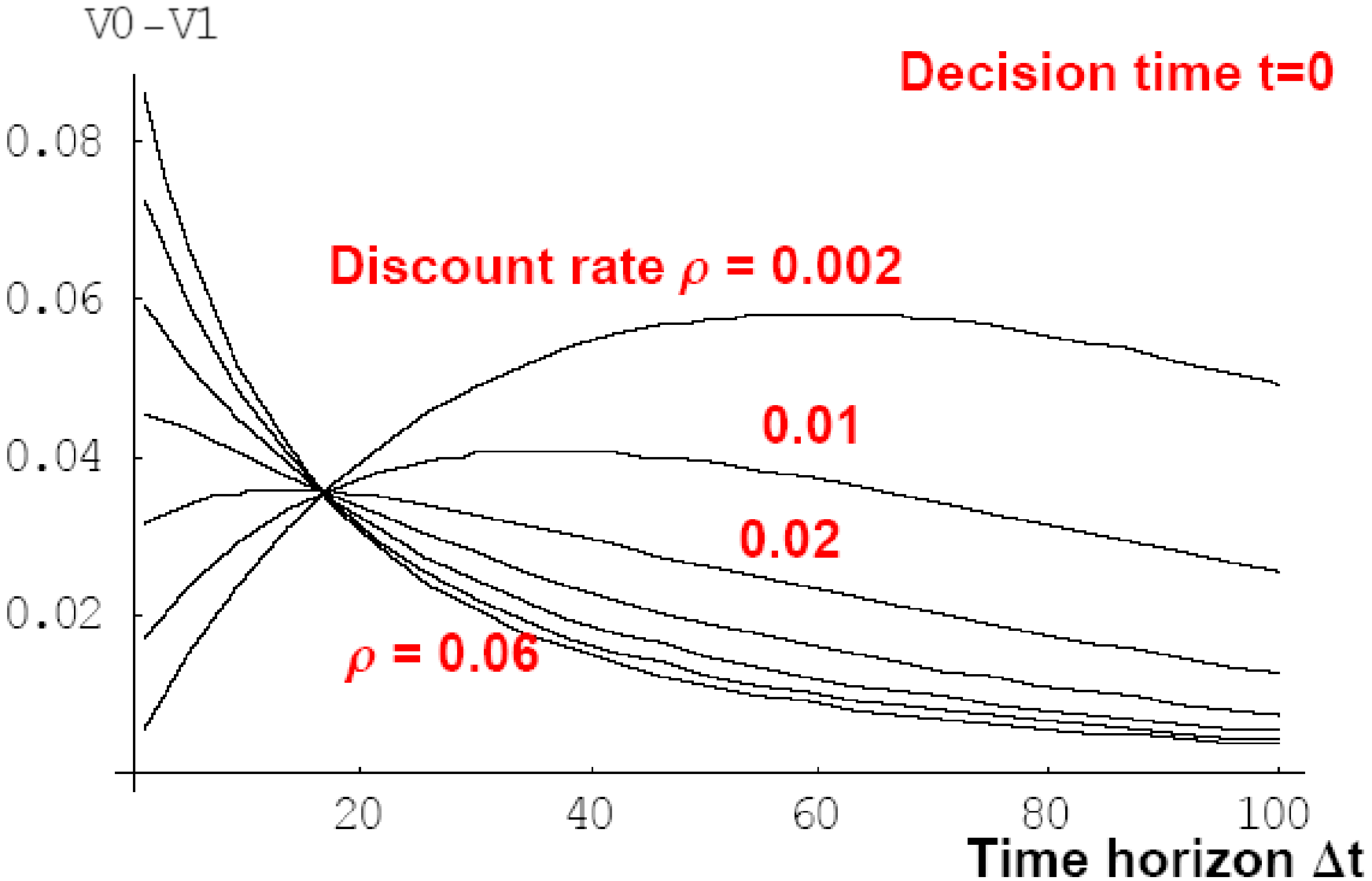
# Value Difference High- vs Low-Emission Technology

for Changing Time Horizon



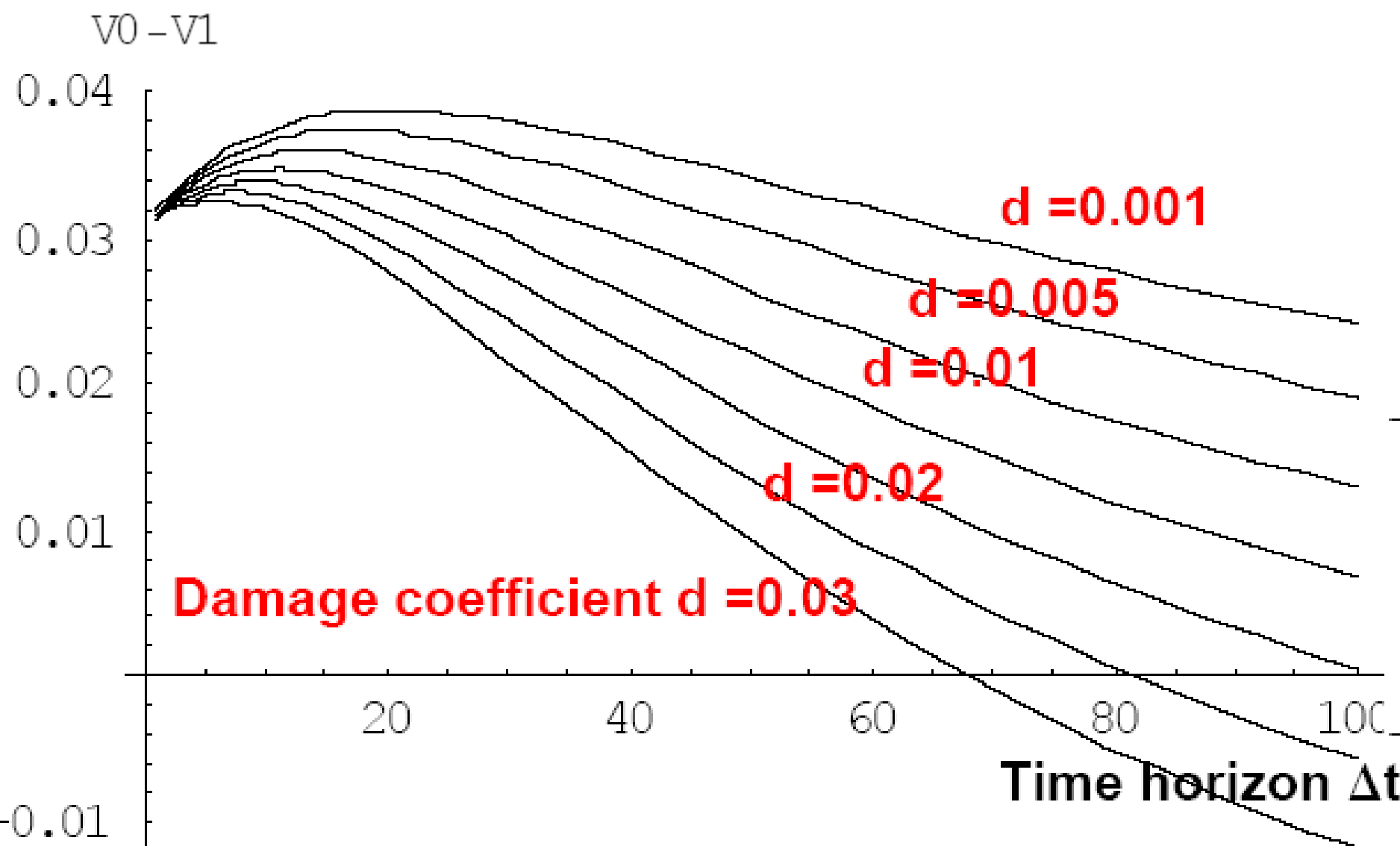
# Value Difference High- vs Low-Emission Technology

for Changing Discount rate

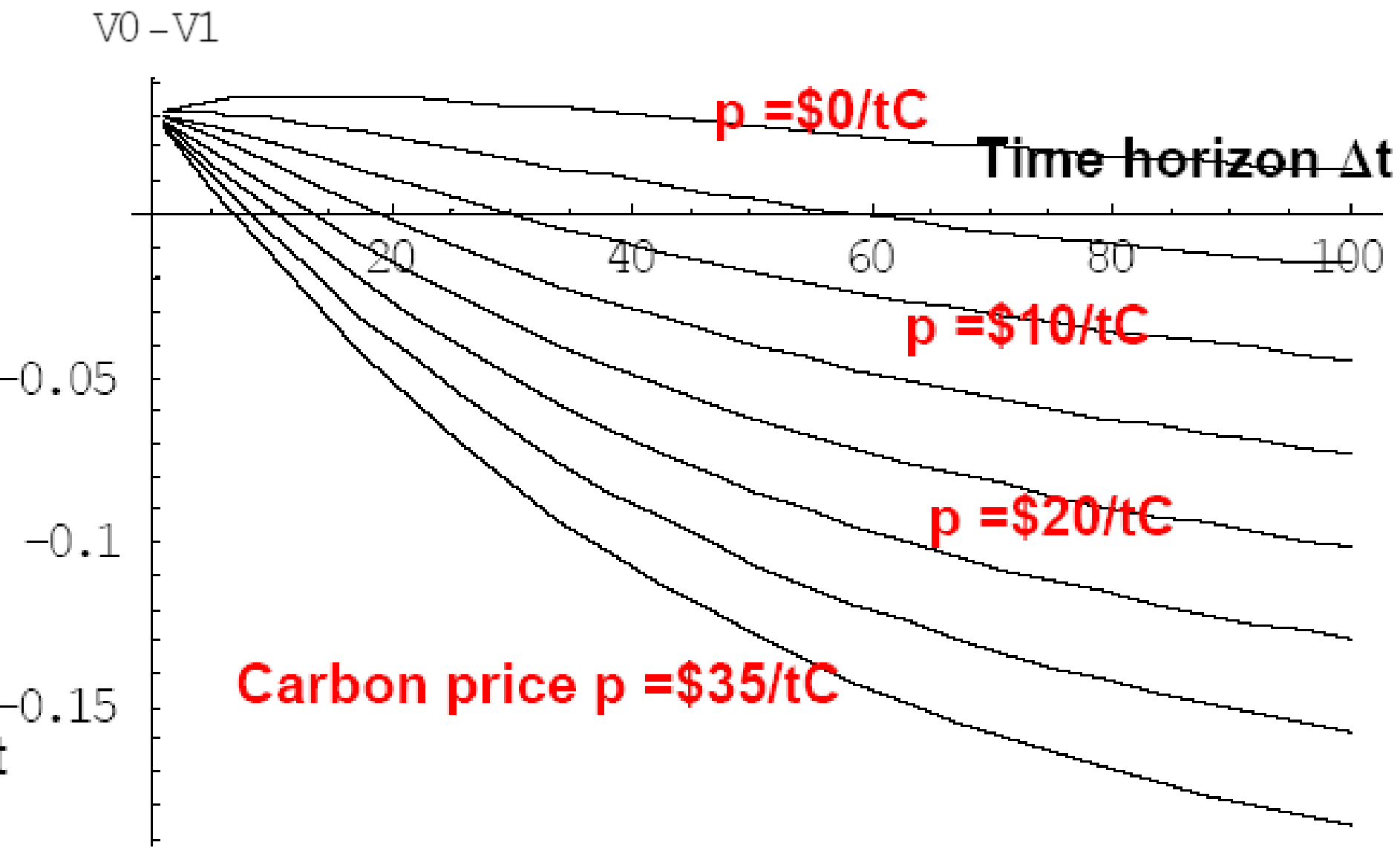


# Value Difference High- vs Low-Emission Technology

for Changing Climate Damage



# Value Difference High- vs Low-Emission Technology for Changing Carbon Price



# Emission Reduction: a Global Cooperation Problem

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$$G(t) = \sum_i G_i(t)(1 - r_i(t)) \leq G^*(t)$$

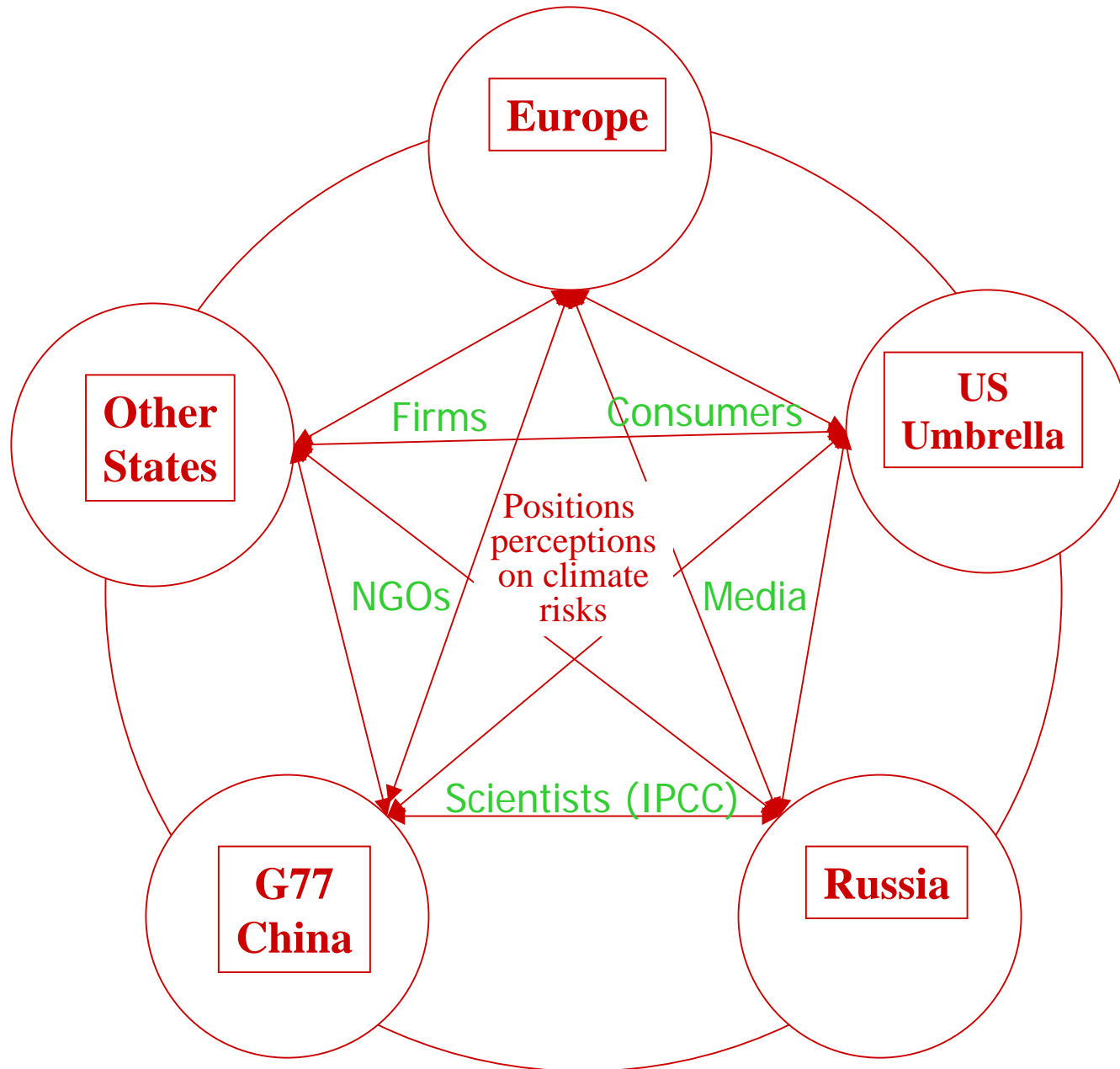
**$G(t)$ : Global emissions at time  $t$**

**$G^*(t)$ : Global emission target at time  $t$**

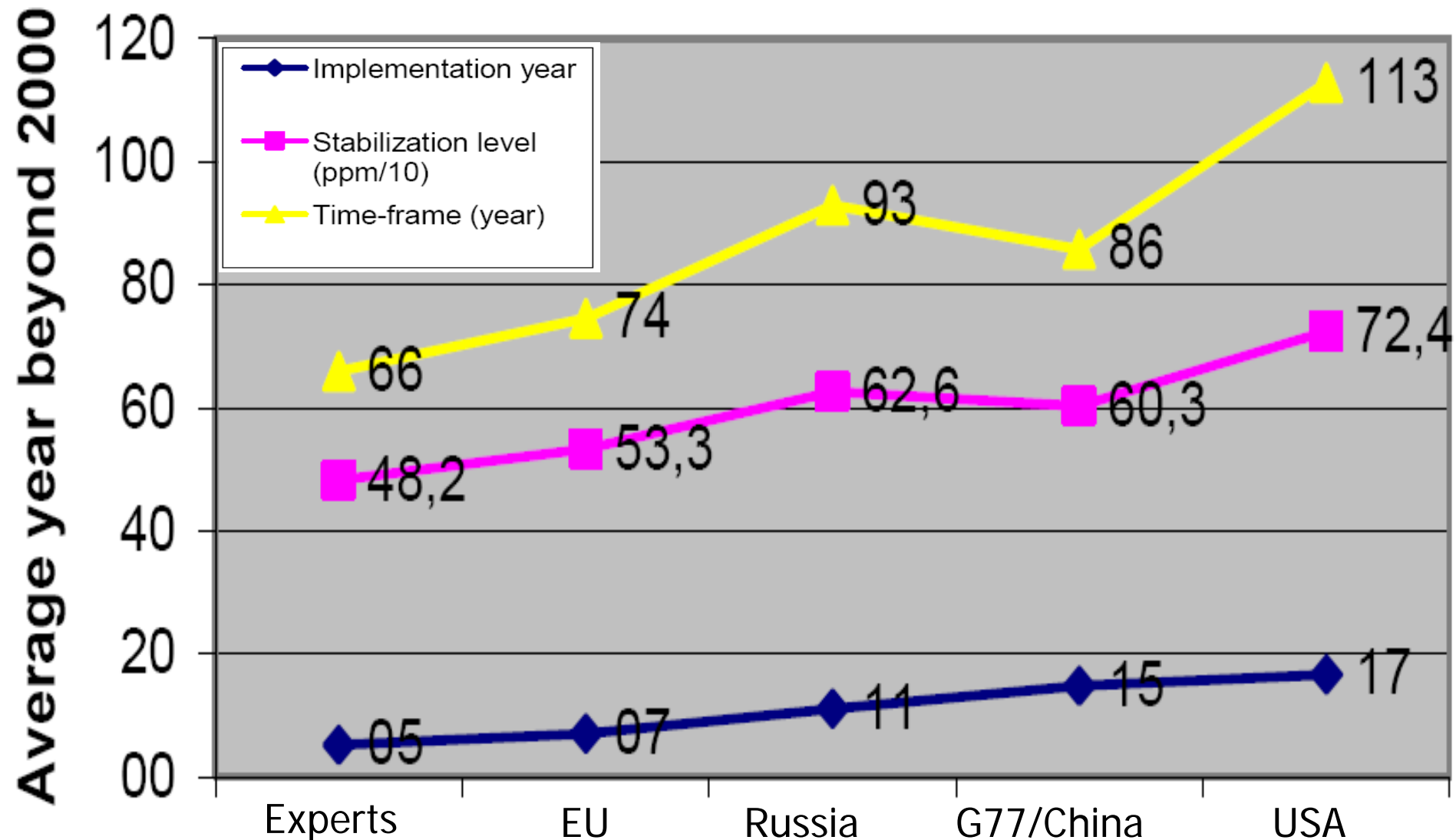
**$G_i(t)$ : Baseline emissions path of actor  $i$**

**$r_i(t)$ : Emission reduction of  $i$  from baseline**

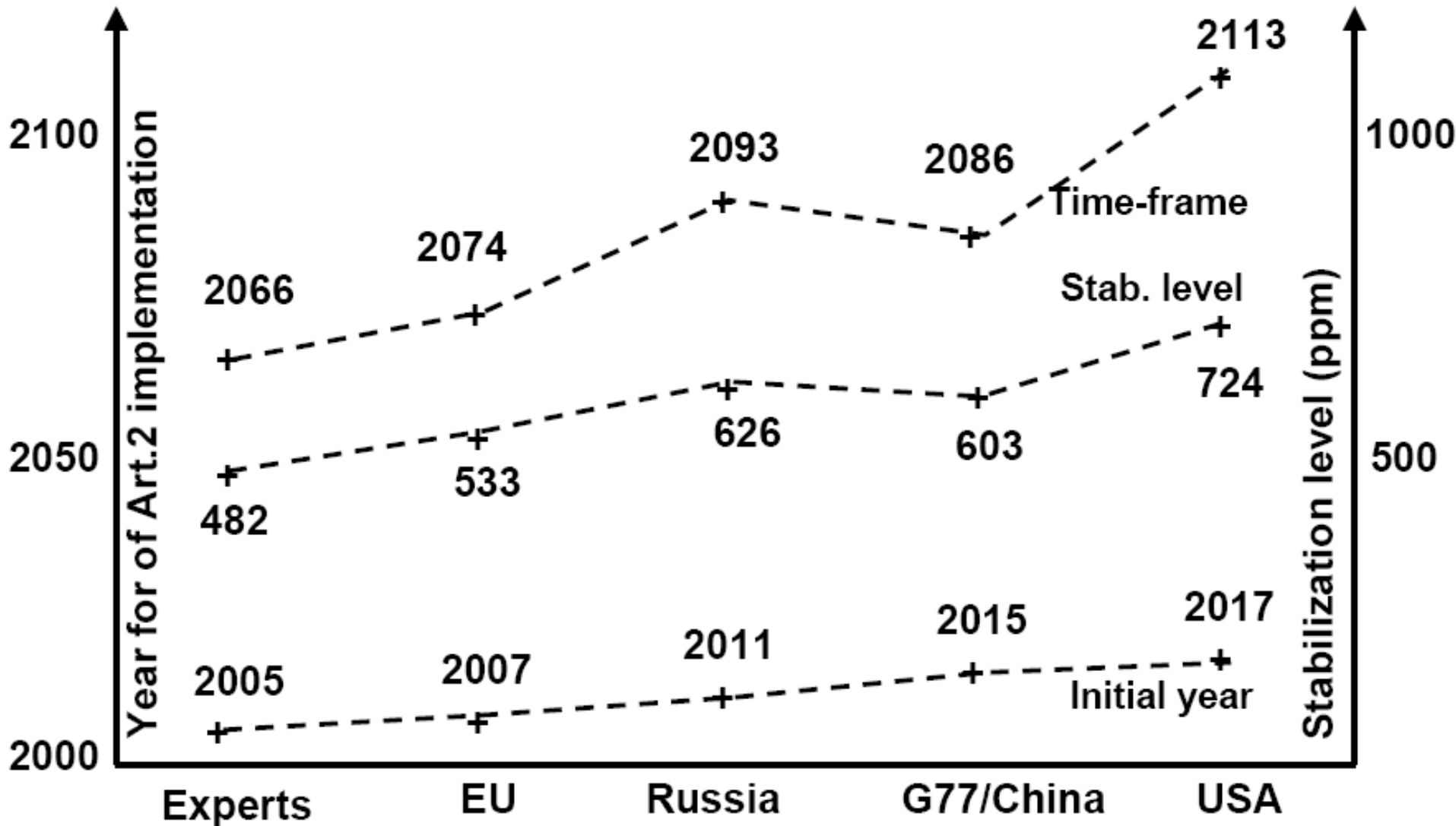
# Major Actors in Climate Policy



# Expert Survey on Art. 2 at COP8, New Delhi 2002

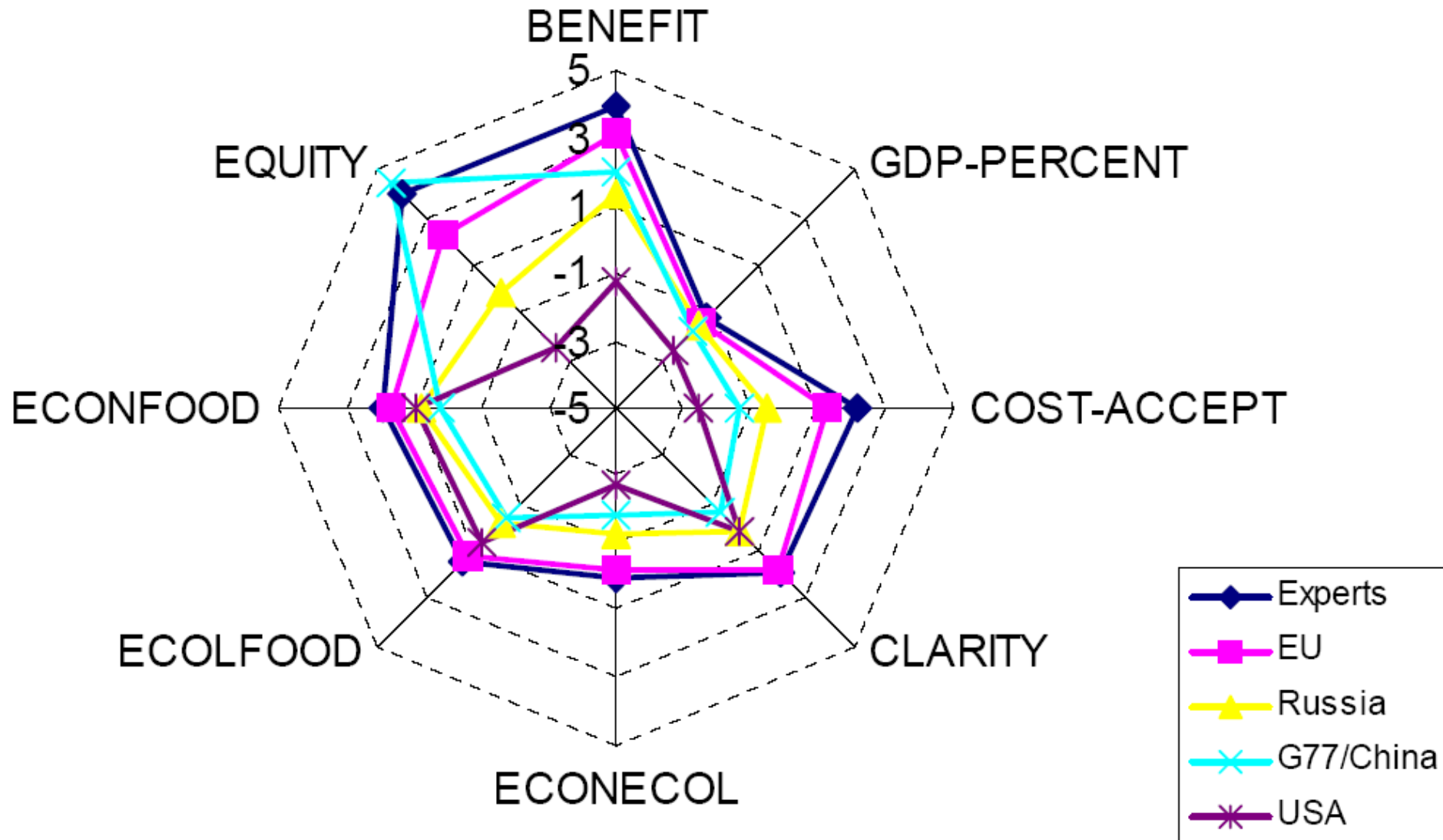


# Average Positions on Stabilization Expert Survey at COP8, New Delhi 2002

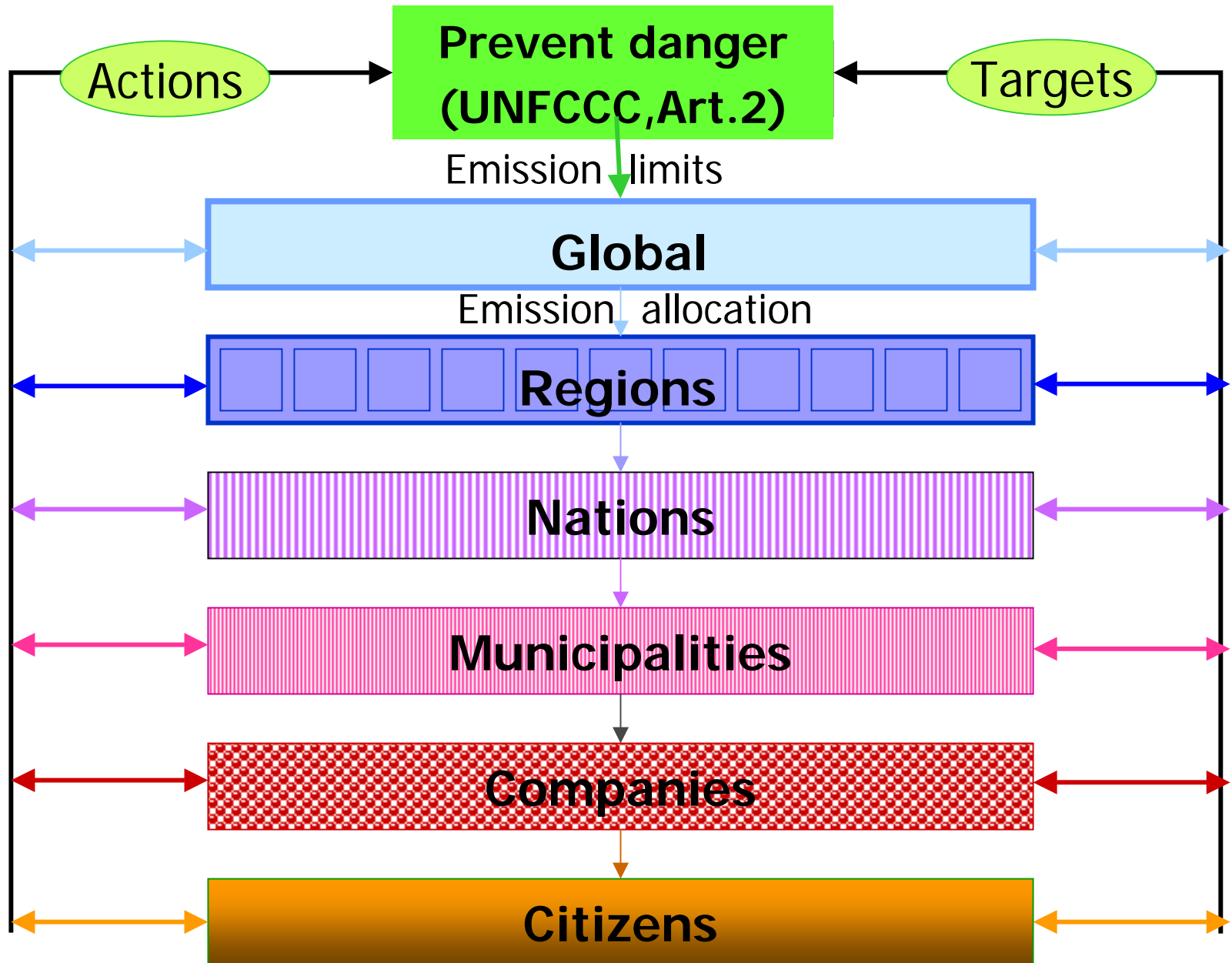




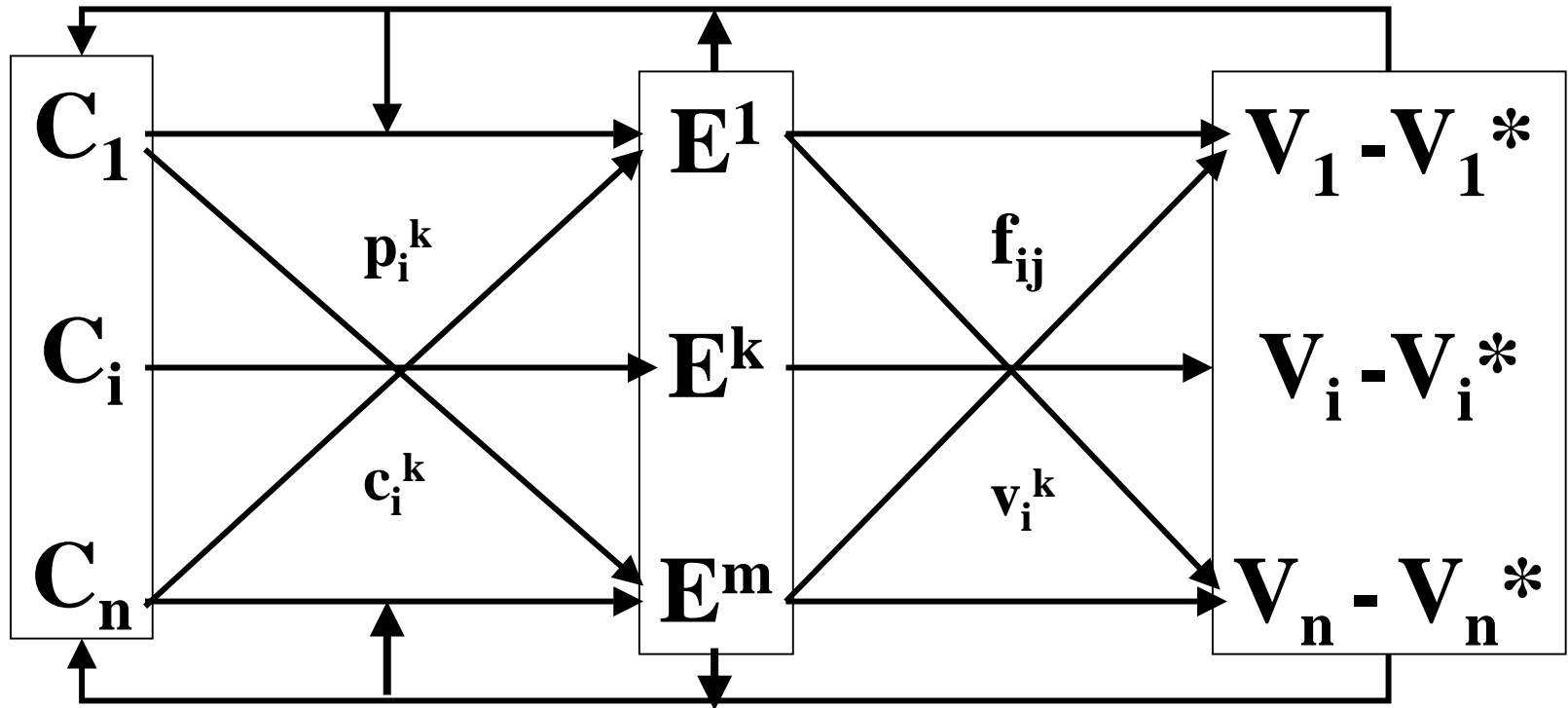
# Average Actor Positions in Multi-criteria Chart



# Micro-macro and Multi-level Decisionmaking



# Integrated Assessment with Multiple Actors



Investment

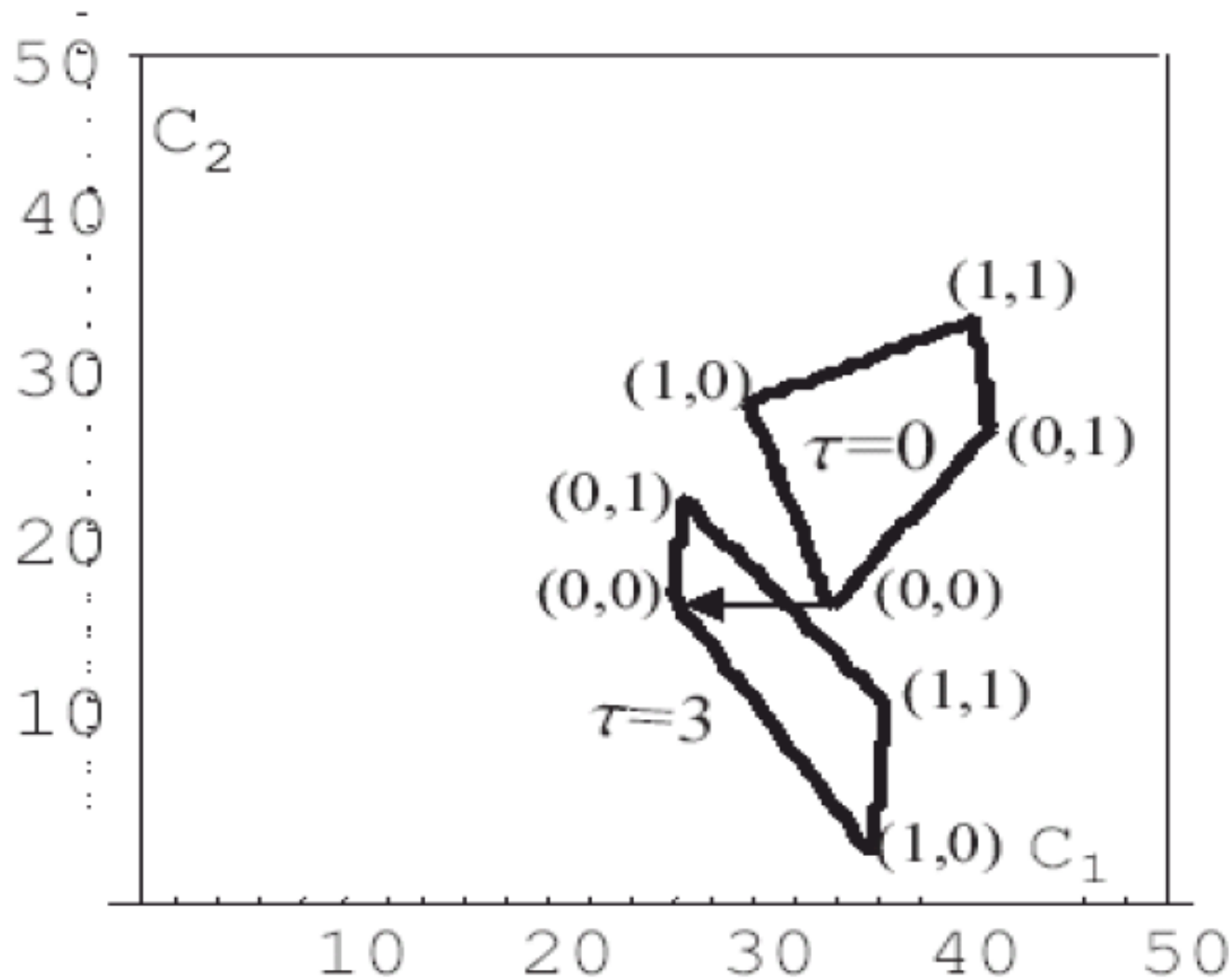
Allocation  
Costs  
Prices

Energy  
Systems

Efficiency  
Benefits  
Risks

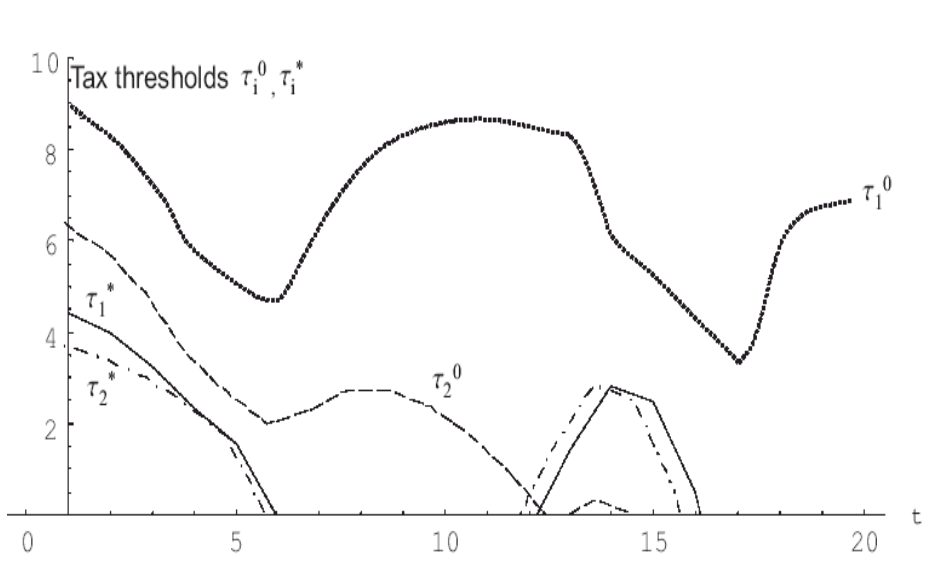
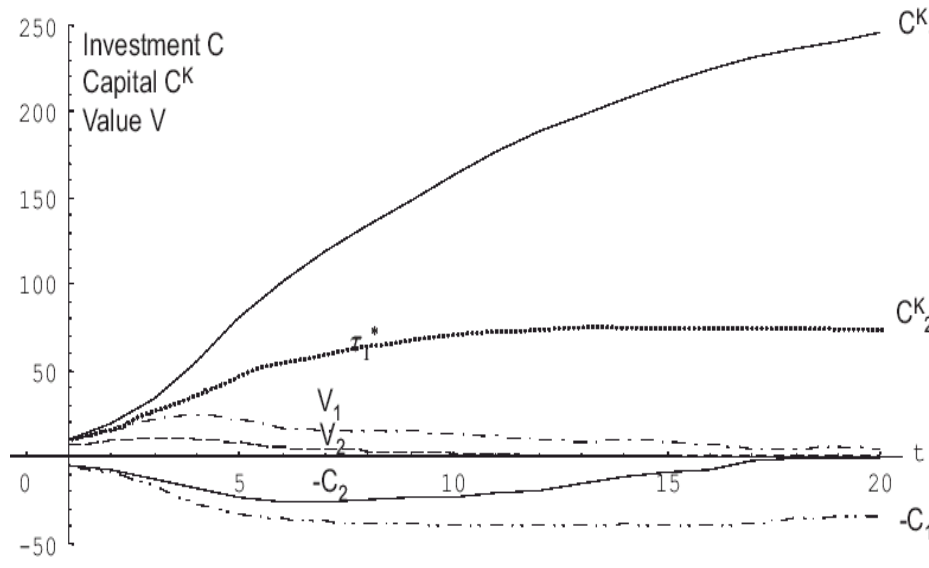
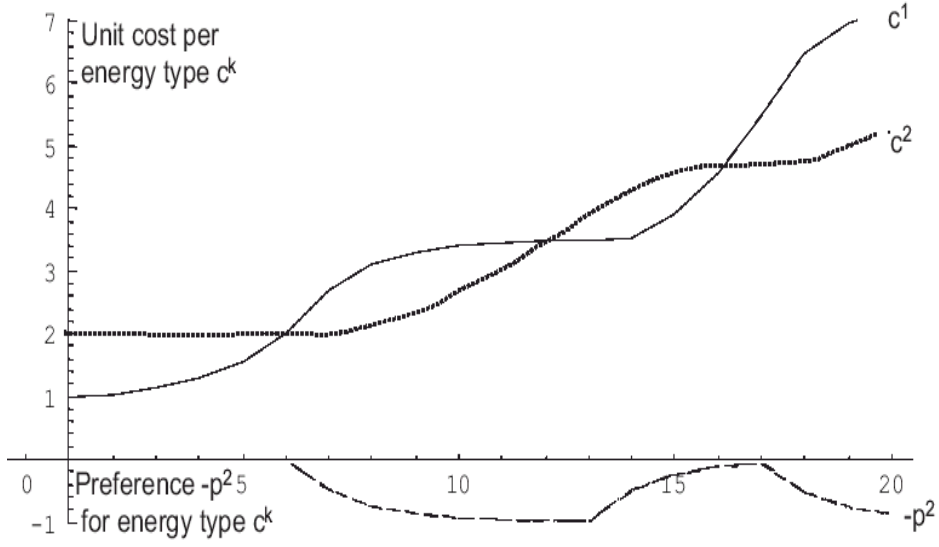
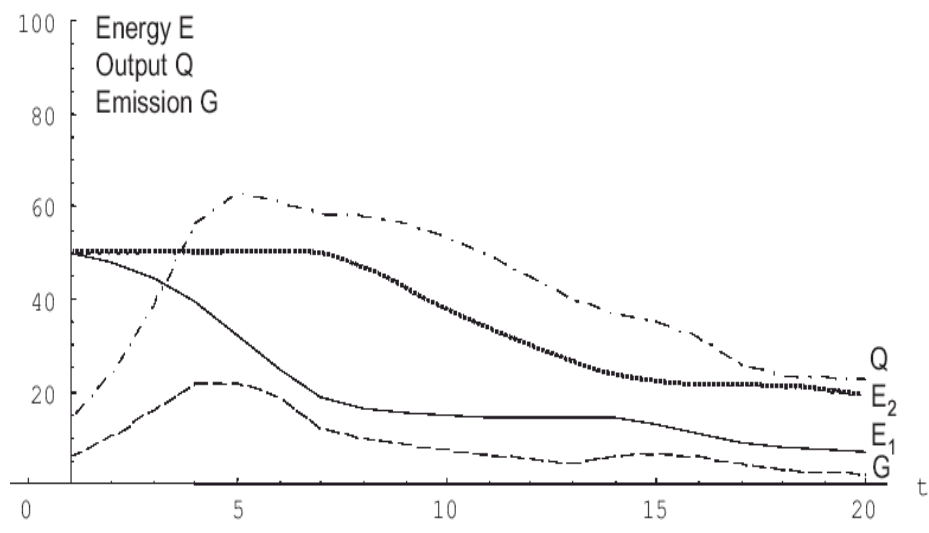
Values  
Goals

# Tax-induced Technology Switching Among Economic Competitors



Equilibria in investment space ( $C_1$ ,  $C_2$ ) of two firms with choice between high emission technology ( $p=0$ ) and low emission technology ( $p=1$ ) for tax  $\tau = 0$  and  $\tau = 3$ .

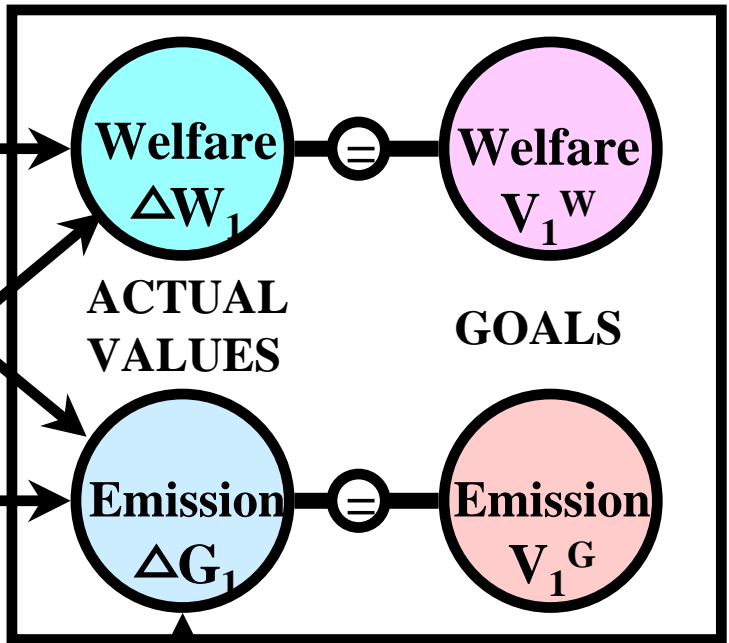
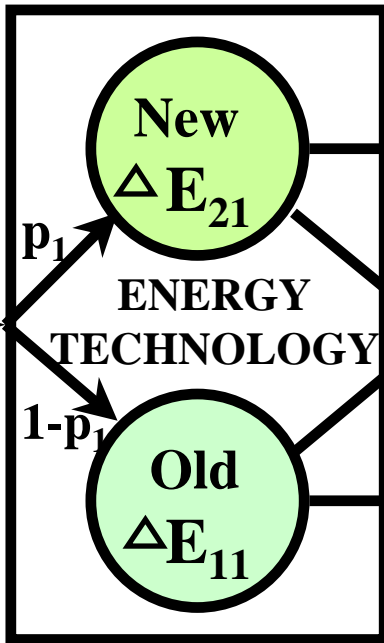
# Competition of Two Energy Paths with Emission Tax



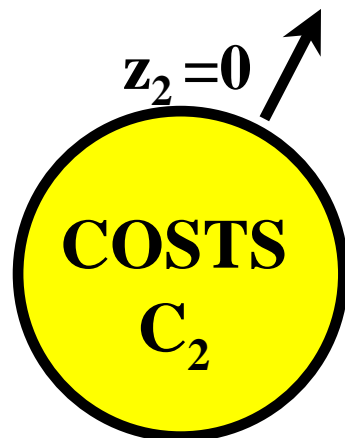
# Industrialized Country (IC)



$z_1 C_1$  for Clean Development

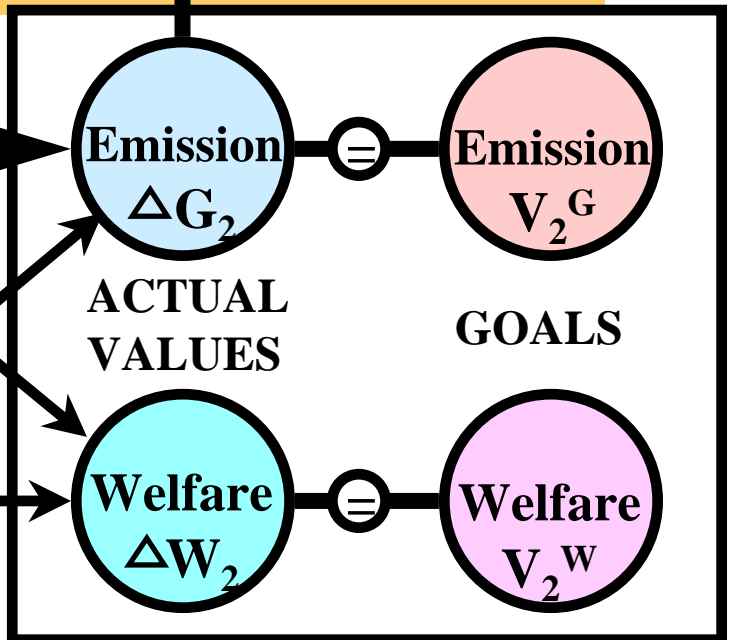
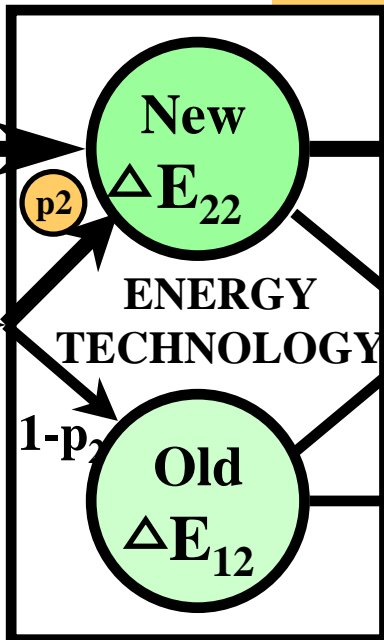


CDM emission reduction for IC

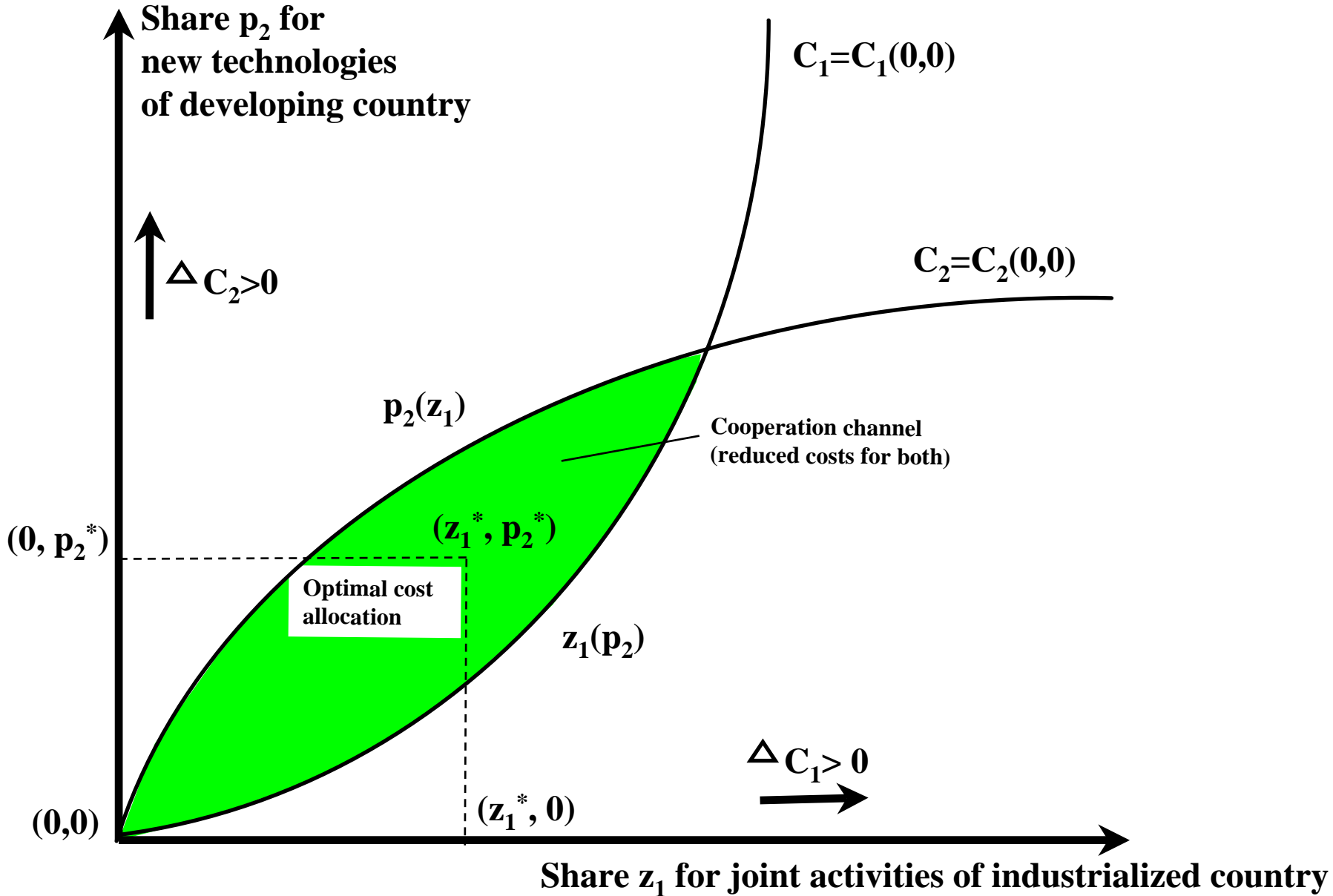


# Developing Country (DC)

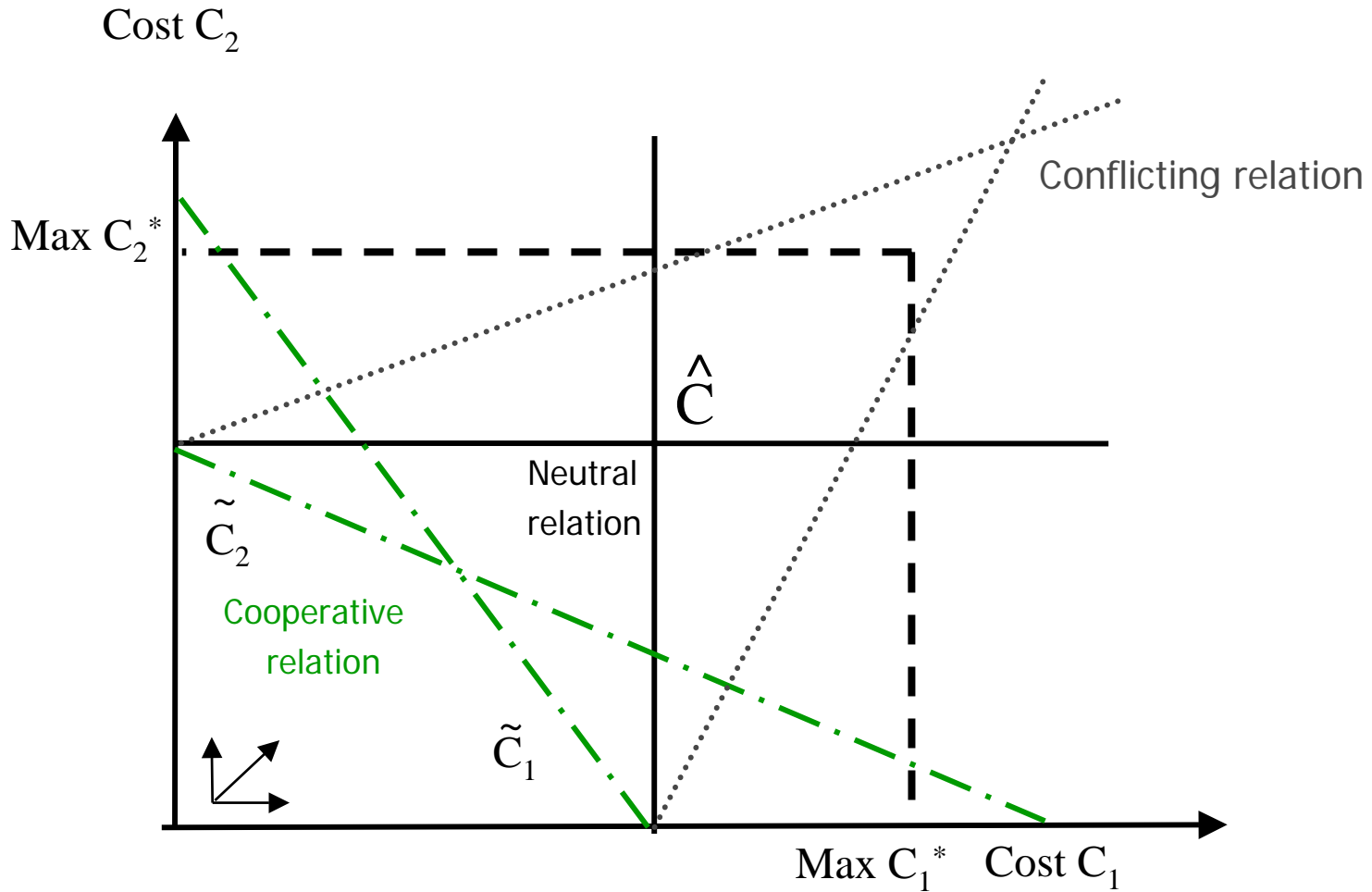
$z_2 = 0$



# Cooperation Channel for Low Emission Technology



# Conflict vs. Cooperation



$$\text{Target cost } \tilde{C}_i = (\Delta V_i^* - f_{ij} C_j) / f_{ii}$$



# Model Specifications of Multi-regional Emissions Trading

## Regions

AFR Sub-Saharan Africa

CPA China, Mongolia, Vietnam, Cambodia, Laos

EEU Eastern Europe

FSU Former Soviet Union

LAM Latin America, Caribbean

MEA Middle East, North Africa

NAM North America

PAO Pacific OECD (Japan, Australia, New Zealand)

PAS Other Pacific Asia

SAS South Asia (India)

WEU Western Europe

## Parameter settings

GDP and emission data of 2005 (ICLIPS ref.)

Exponents: production/costs  $\alpha = \gamma = 1,5$

Damage:  $\delta = 2$

Mitigation cost: 5% reduction, 2% GDP loss

## Scenarios

BAU - Business as usual (emission baseline ICLIPS)

epc - equal per capita

10% red. - 10% reduction of 2005 baseline level (only ICs)

stabilis. - stabilisation of emissions on 1990 levels

# Emission Trading: Multi-actor Dynamic Game

Incremental value of firm for emission reduction  $r_i$

$$\frac{\partial V_i}{\partial r_i} = (-u_i + 2d_i G - 2c_i r_i \bar{G}_i + \pi) \bar{G}_i - \pi'_i (\bar{G}_i (1 - r_i) - G_i^*) \geq 0.$$

Emission trading price

$$\pi = \frac{\sum_i \pi_i^*}{n} = \frac{\sum_i u_i + 2c_i r_i \bar{G}_i - 2d_i G}{n}.$$

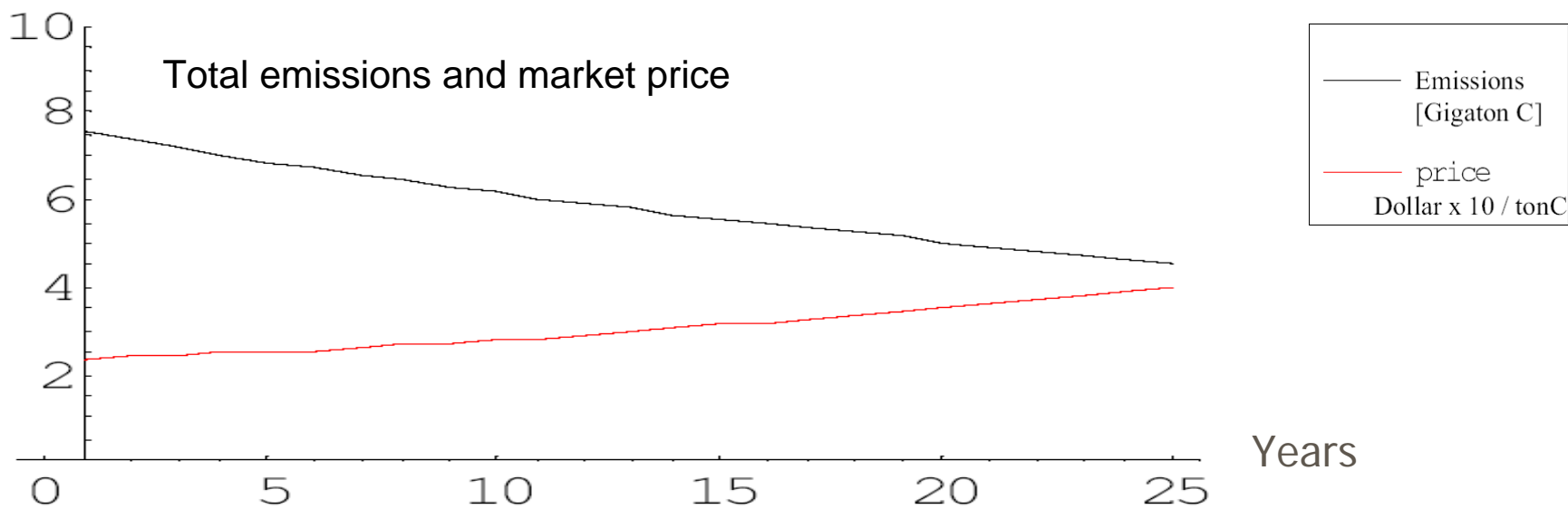
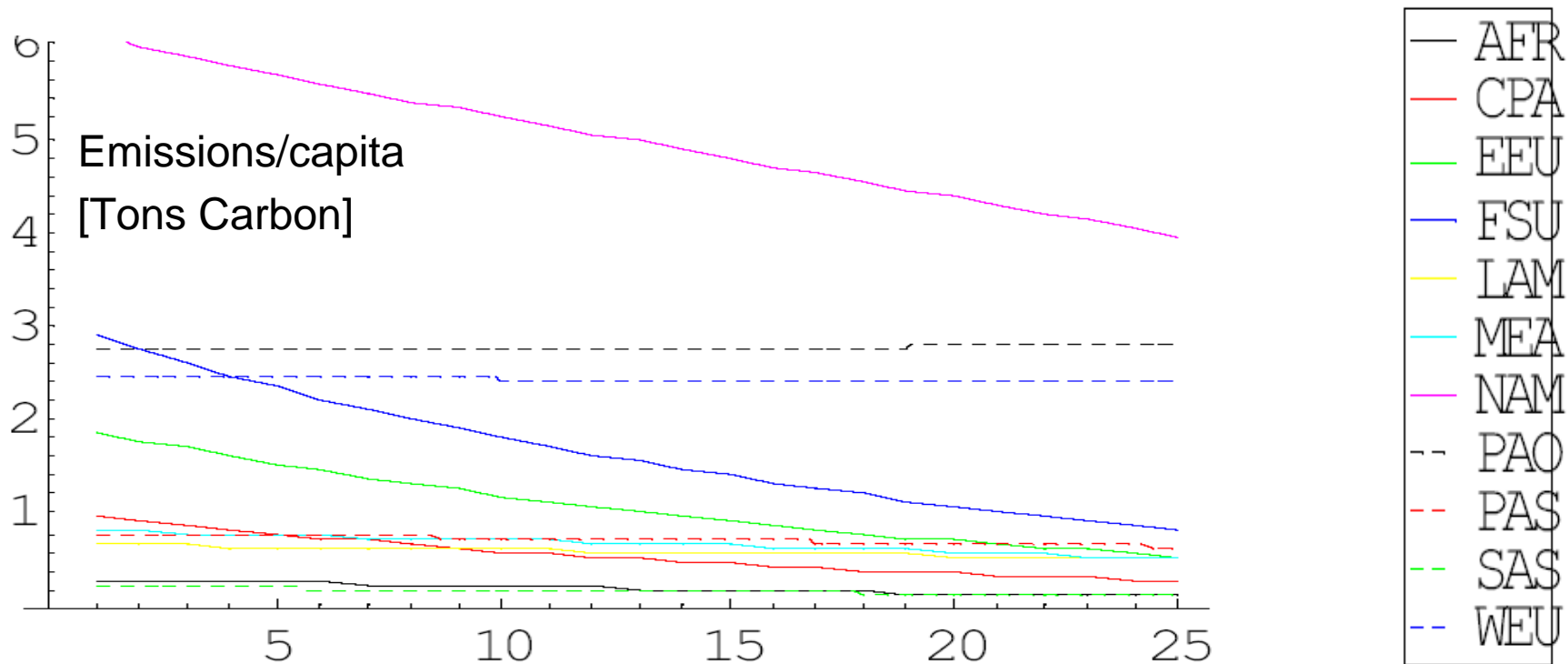
Optimal emission reduction

$$r_i^* = \frac{\sum_{j \neq i} \pi_j^* + u_i - 2d \bar{G}_i - n(u_i - 2d_i(\bar{G}_i + G_{-i})) + 2(G_i^* - \bar{G}_i)(c_i + d)}{2\bar{G}_i[(n-1)(d_i + c_i) - d_{-i}]}$$

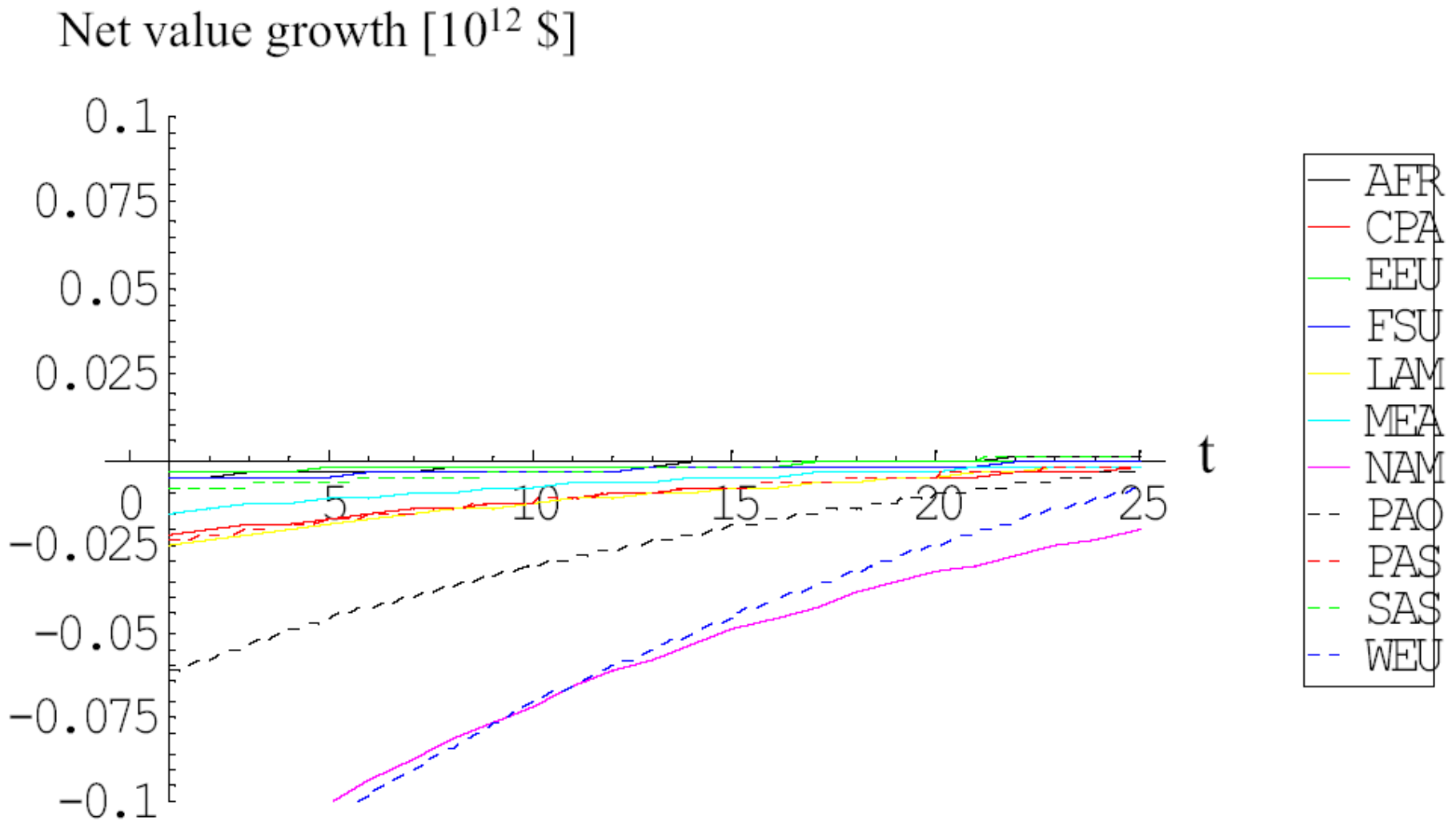
$$\frac{\partial r_i^*}{\partial r_j} = \frac{2\bar{G}_j(c_j + d_{-i} - nd_i)}{2\bar{G}_i[(n-1)(d_i + c_i) - d_{-i}]}.$$

→ Coupled multi-player dynamics of emission reduction and permit price

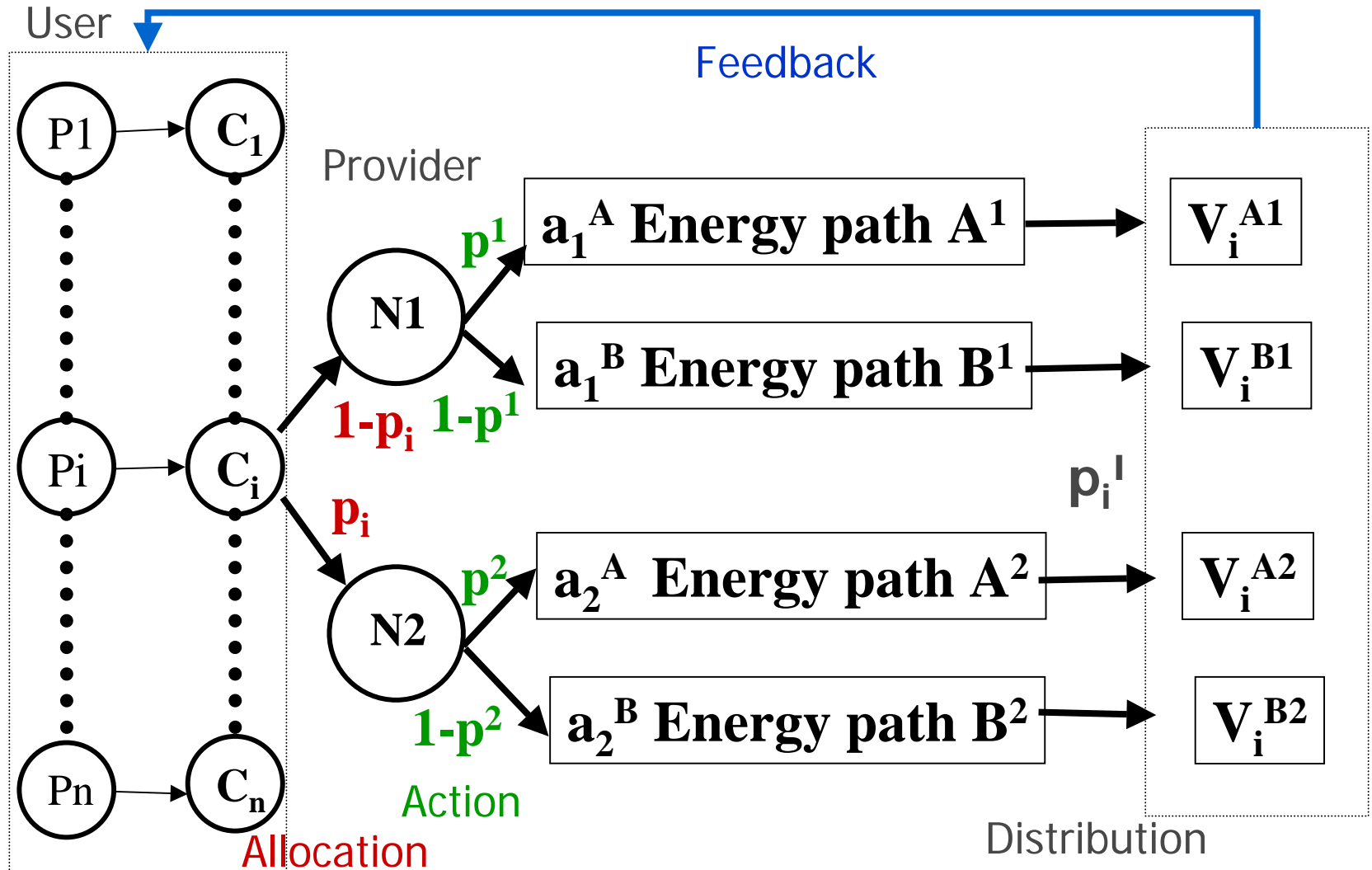
# Simulation of Emission Tradings Among 11 World Regions



# GDP Losses from Emission Reductions

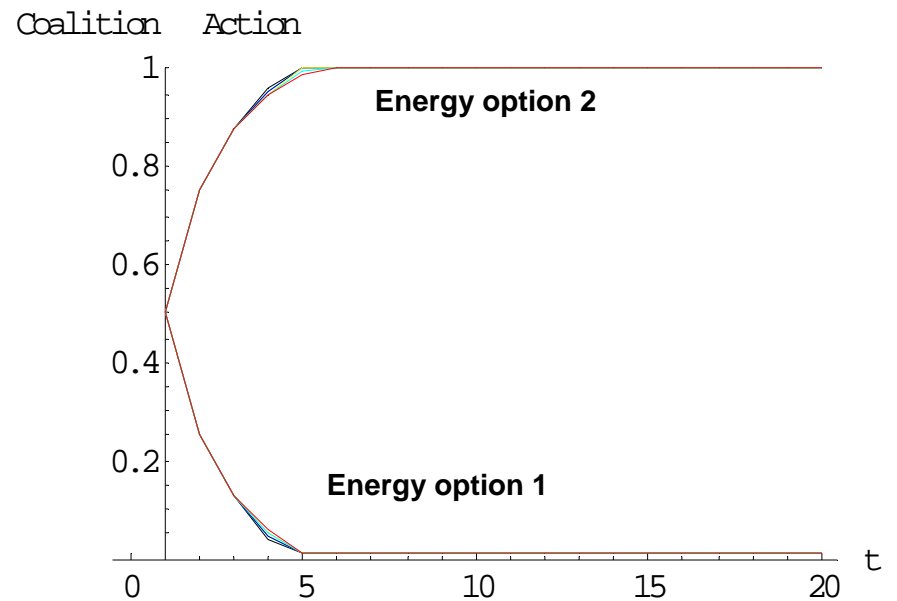
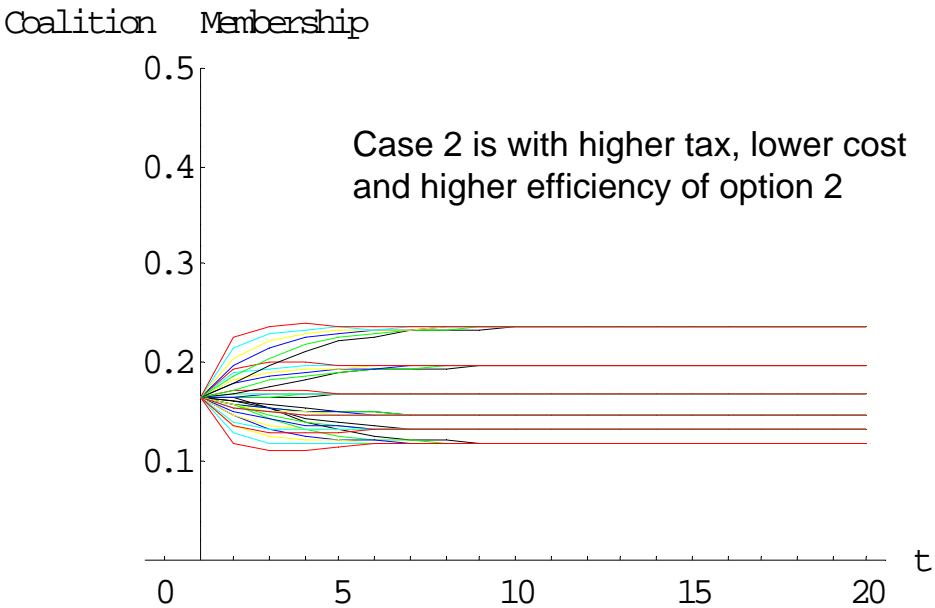
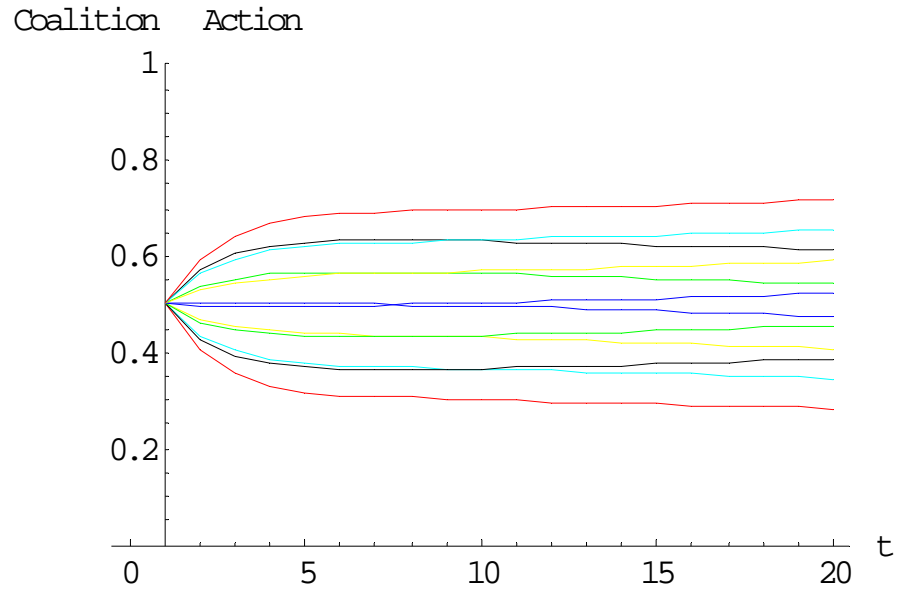
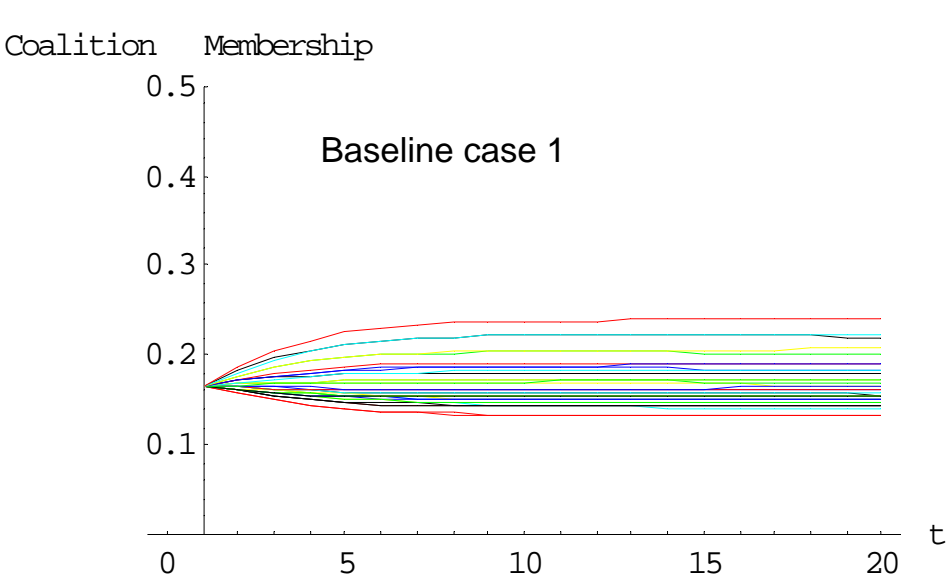


# Coalition Formation in Energy Use

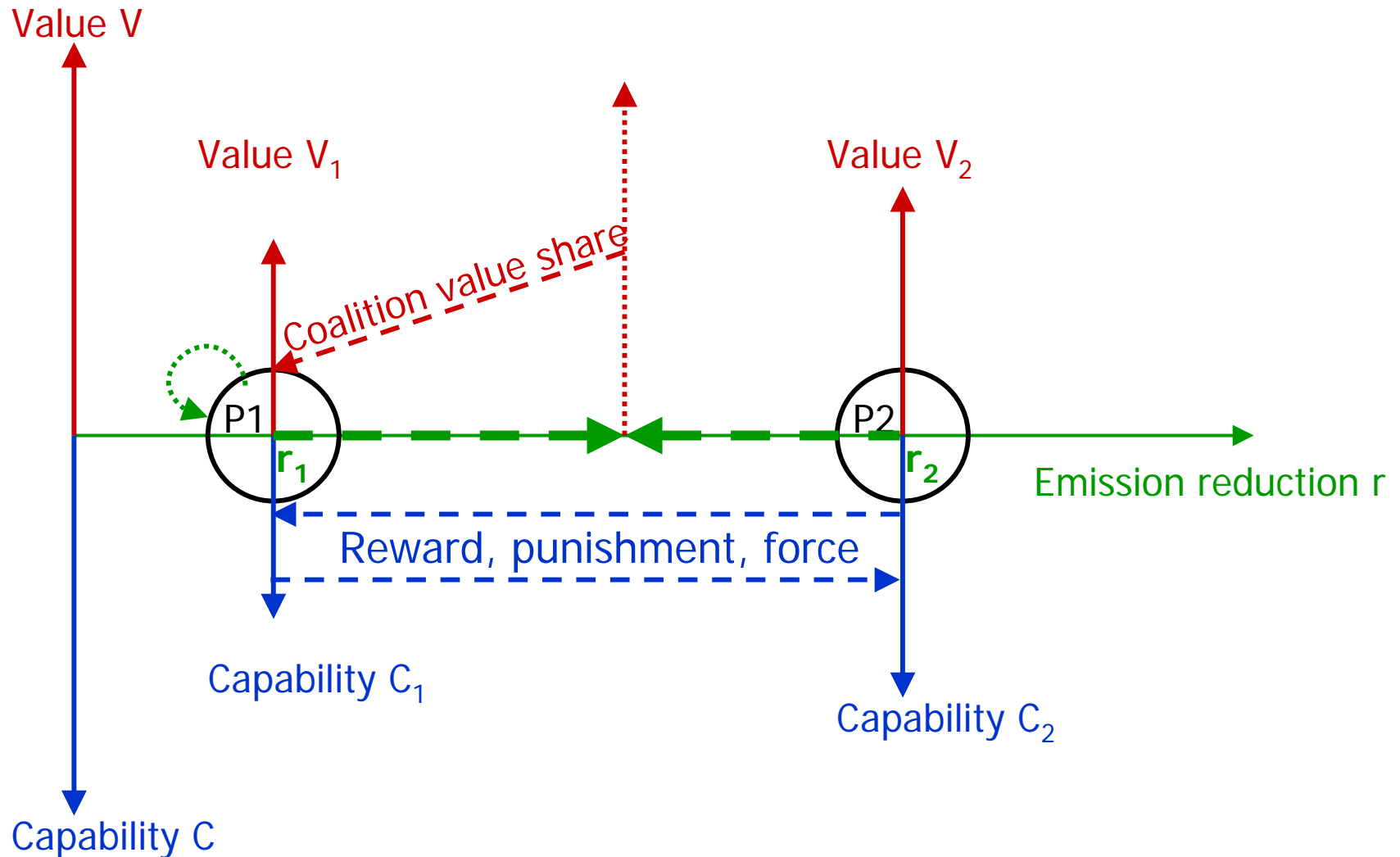


# Coalitions in Energy Management

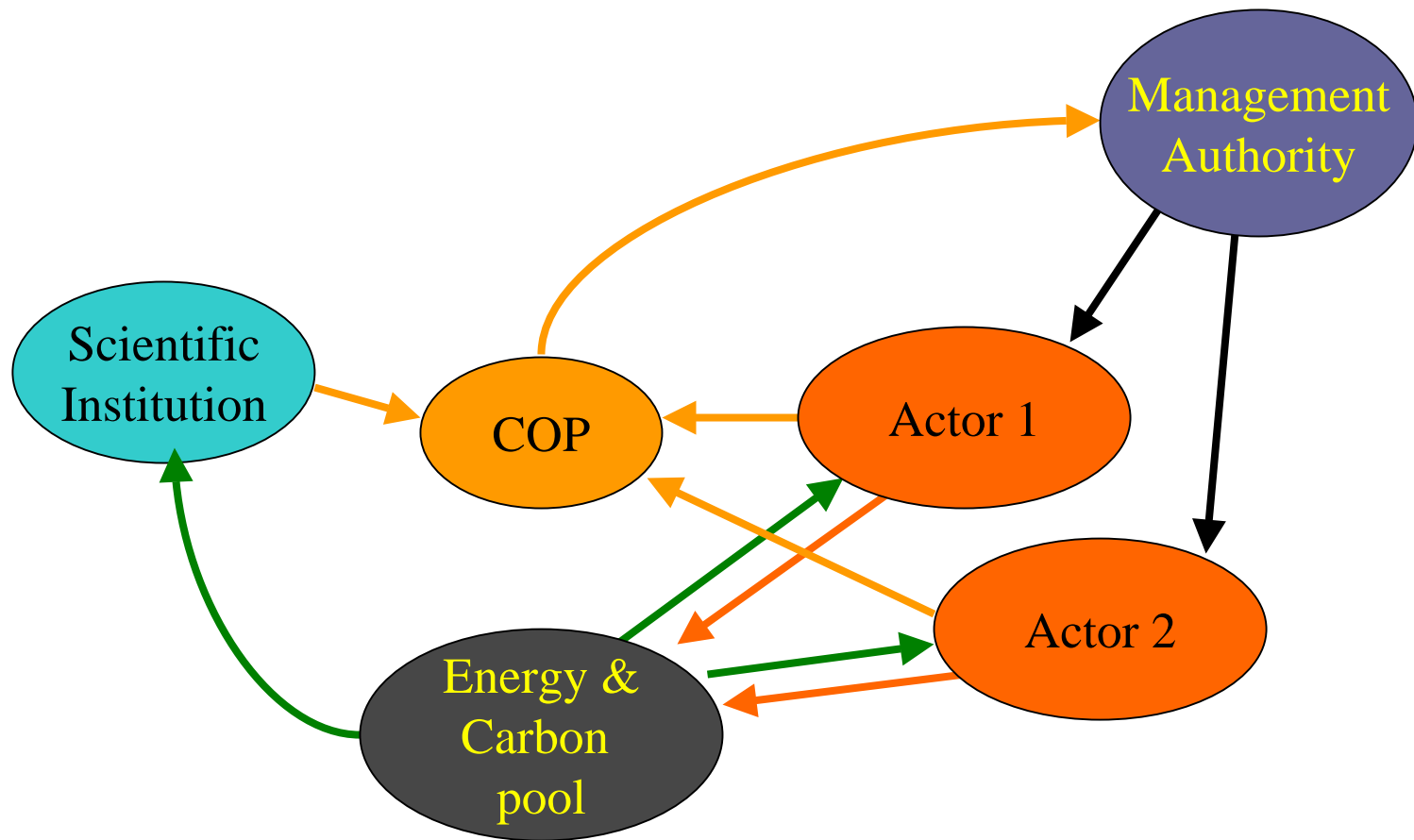
## Simulation with 6 users and 6 providers of energy



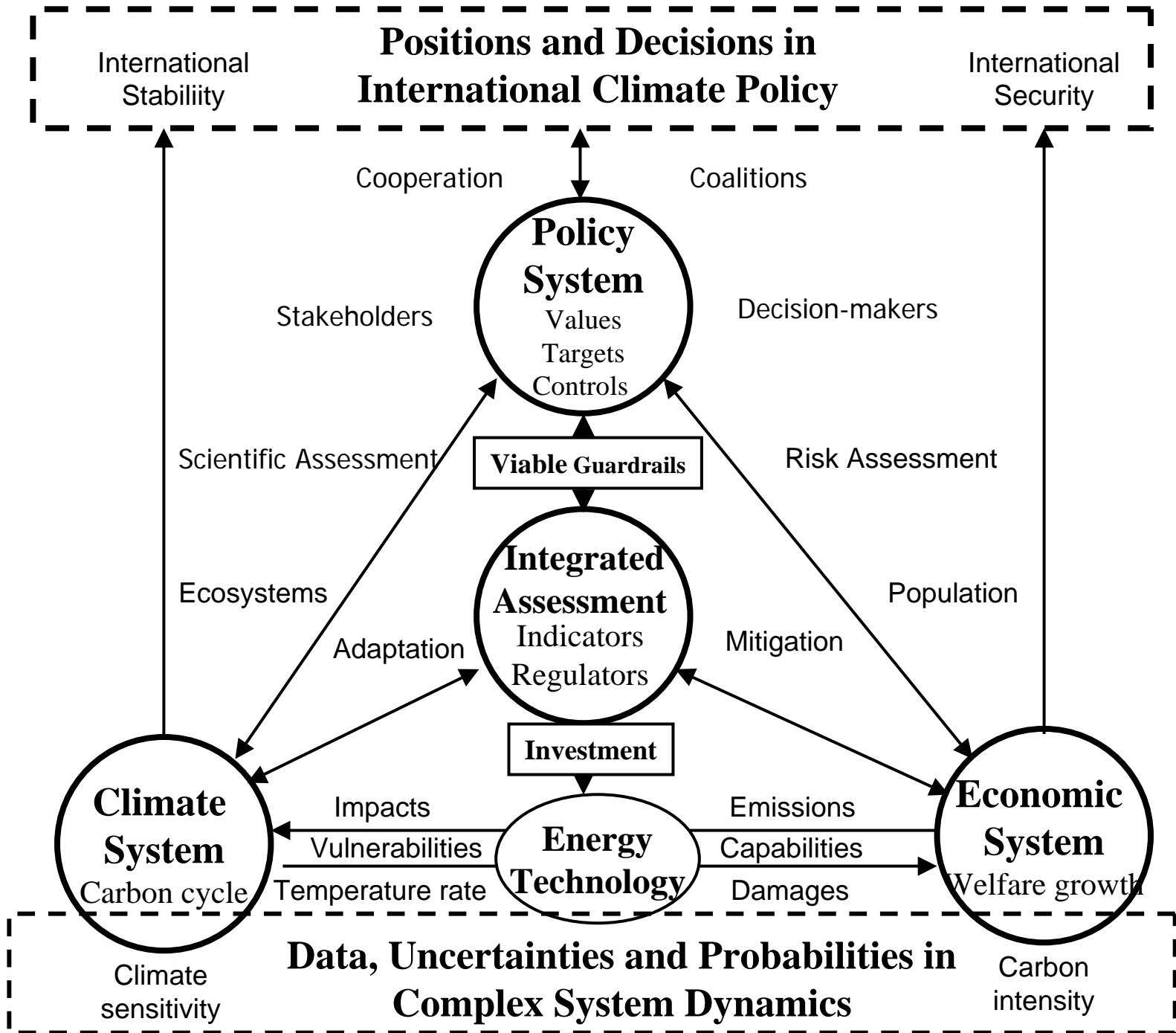
# Factors Influencing Position Change



# Cooperative Management of Energy and Climate Change







# Summary and Outlook

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- Analyse and compare specific energy technologies and paths with regard to economic and environmental conditions, including climate change and risk assessment
- Use advanced methods and modeling tools within integrated assessment framework
- Provide data-based modeling tools for adaptive control and decision-making under uncertainty
- Develop and integrate climate, economy and decisionmaking tools into a probabilistic integrated assessment framework on emission reductions and climate change
- Involve multi-actor interaction in understanding the chance of realization of policy actions.