

# Human and Nature Dynamics (HANDY): Modeling Inequality and Sustainability

---

**Safa Motesharrei, Jorge Rivas**

**Eugenia Kalnay**

University of Maryland

**Numerical Analysis and Predictability**

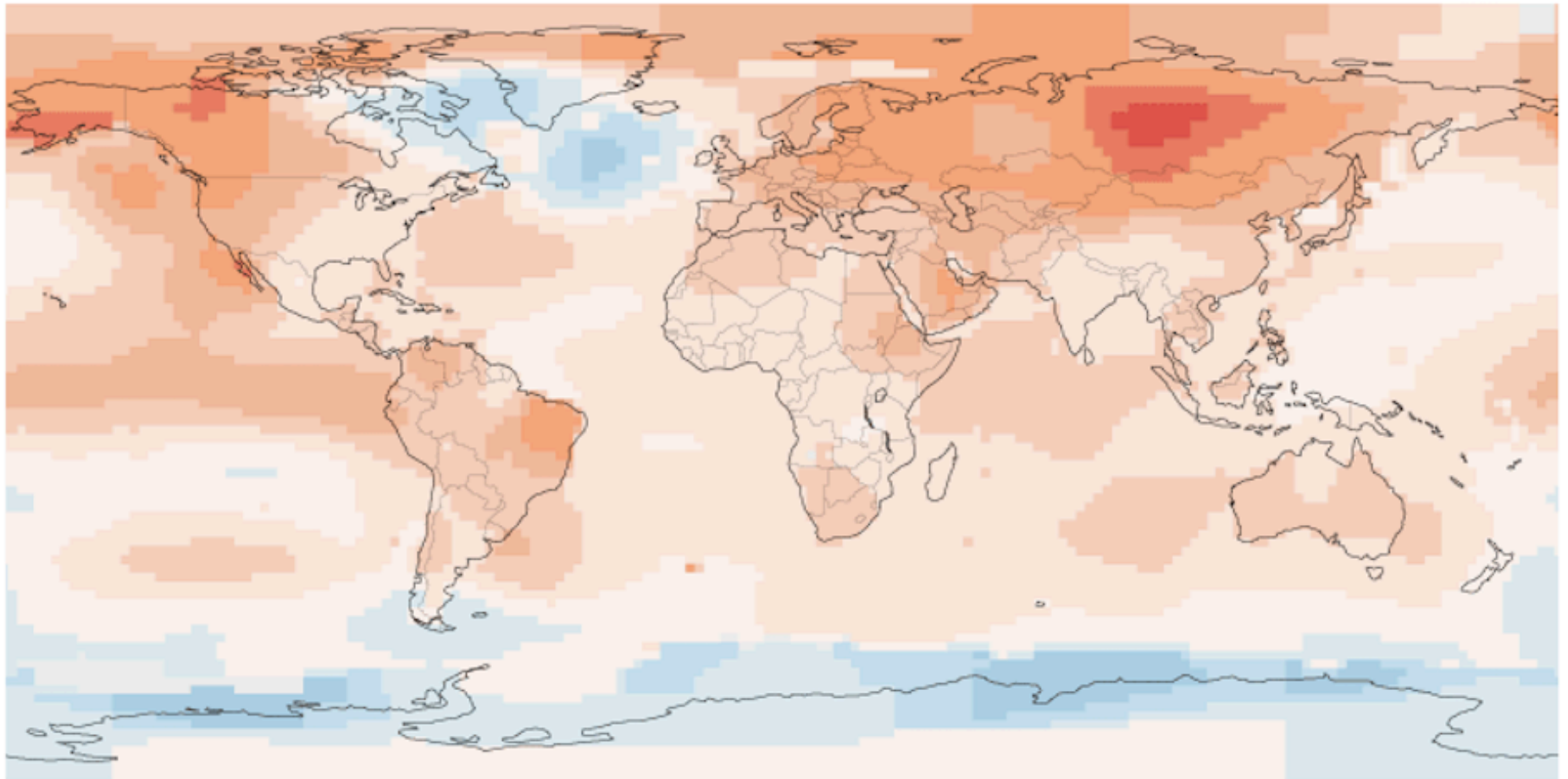
**University of Pittsburgh,**

**3-4 May 2016**

# Is climate change really happening?

## The Hottest Year on Record

Globally, 2015 was the warmest year in recorded history.



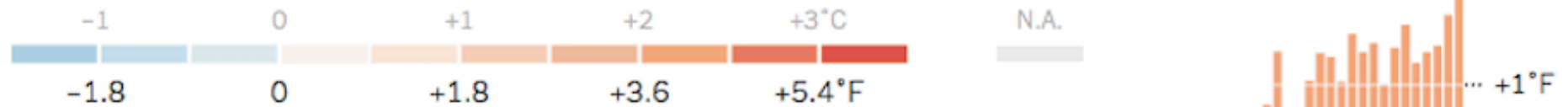
**How far above or below average temperatures were in 2015**

*Compared with the average from 1901 to 2000*

# Is climate change really happening?

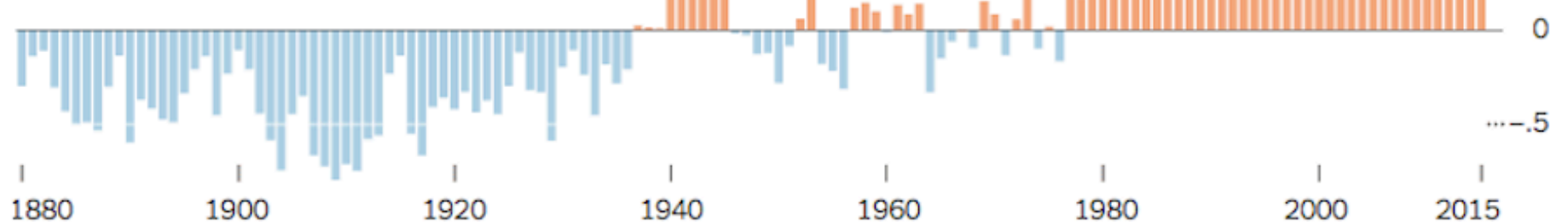
## How far above or below average temperatures were in 2015

Compared with the average from 1901 to 2000



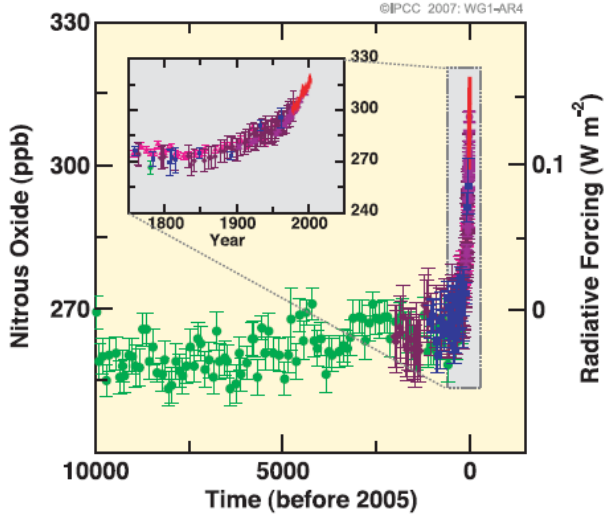
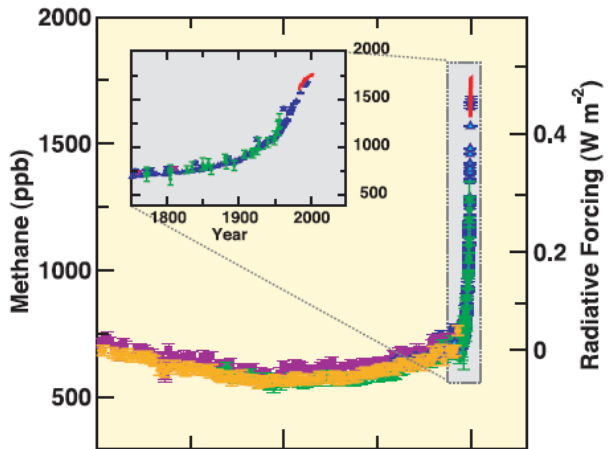
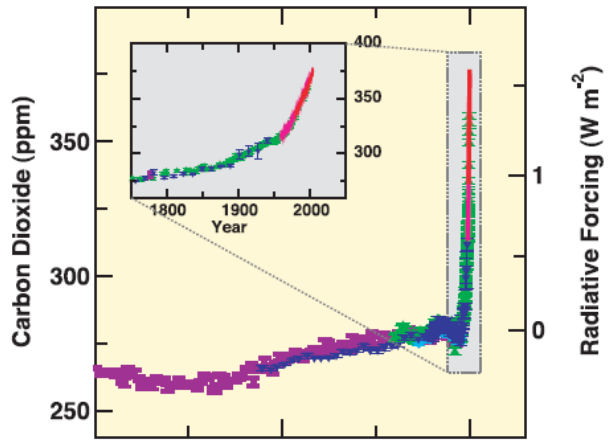
## Average global surface air temperatures

Compared with the average from 1901 to 2000

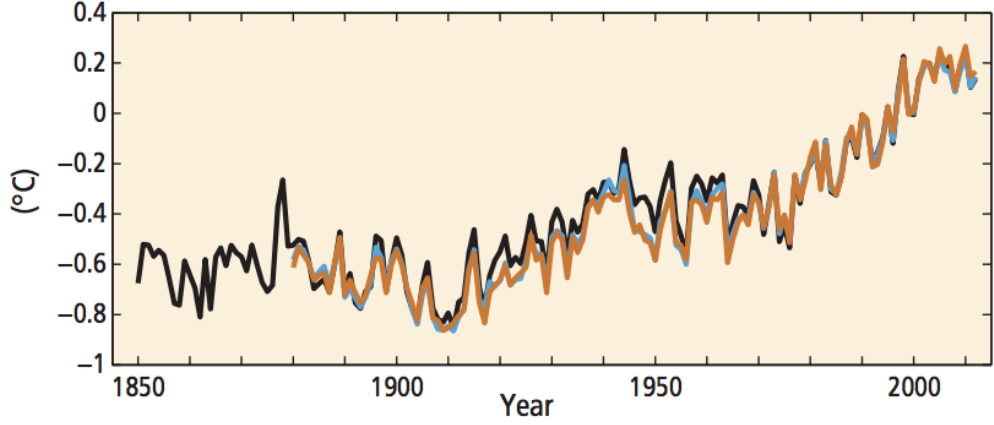


Source: NASA Goddard Institute for Space Studies

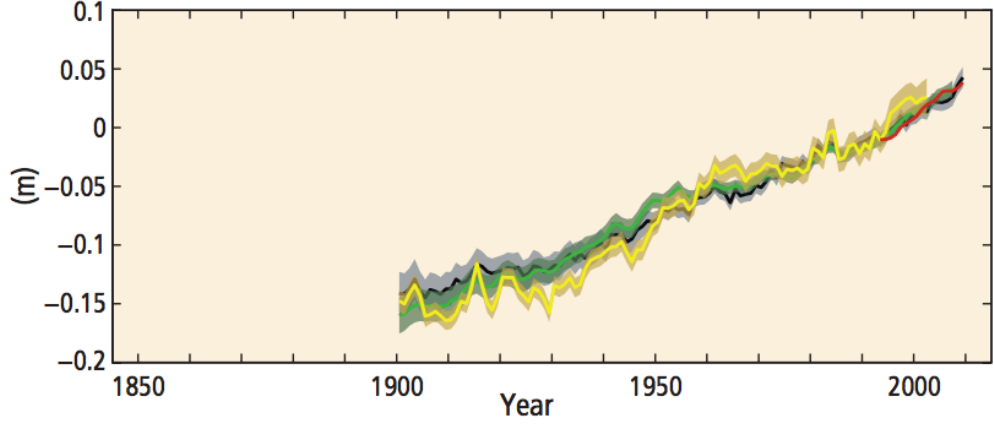
By The New York Times



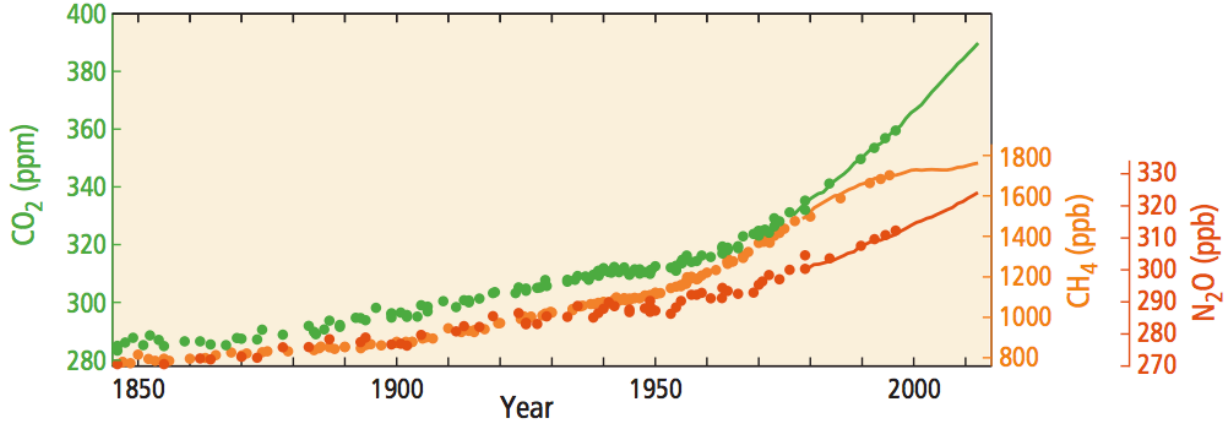
(a) Globally averaged combined land and ocean surface temperature anomaly



(b) Globally averaged sea level change



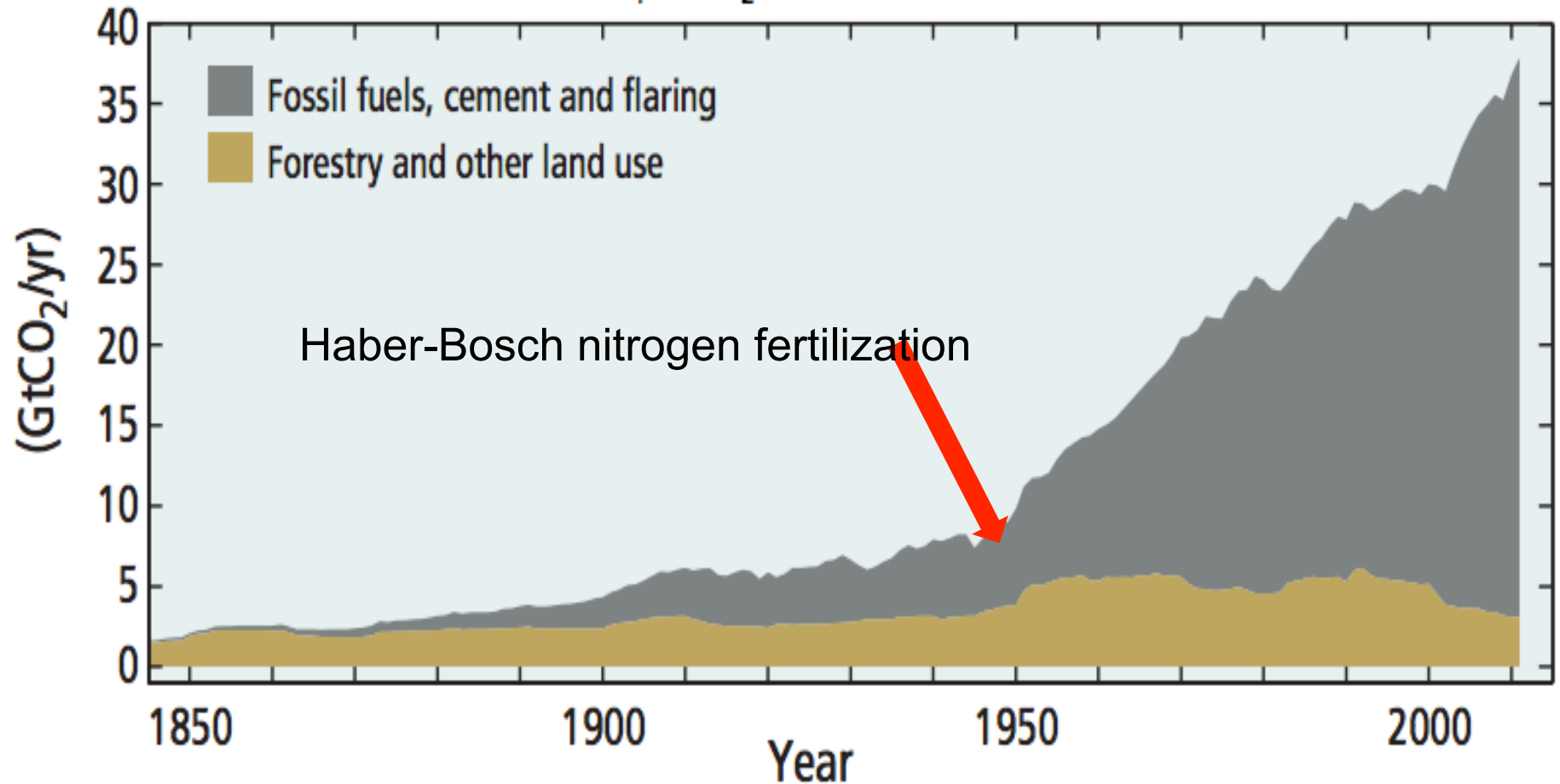
(c) Globally averaged greenhouse gas concentrations



(d)

## Global anthropogenic CO<sub>2</sub> emissions

Quantitative information of CH<sub>4</sub> and N<sub>2</sub>O emission time series from 1850 to 1970 is limited



# Climate change

---

Since 1800 we are **burning the fossil fuels** that Nature accumulated during **millions of years**.

By burning the accumulated carbon we **emit CO<sub>2</sub>** into the atmosphere.

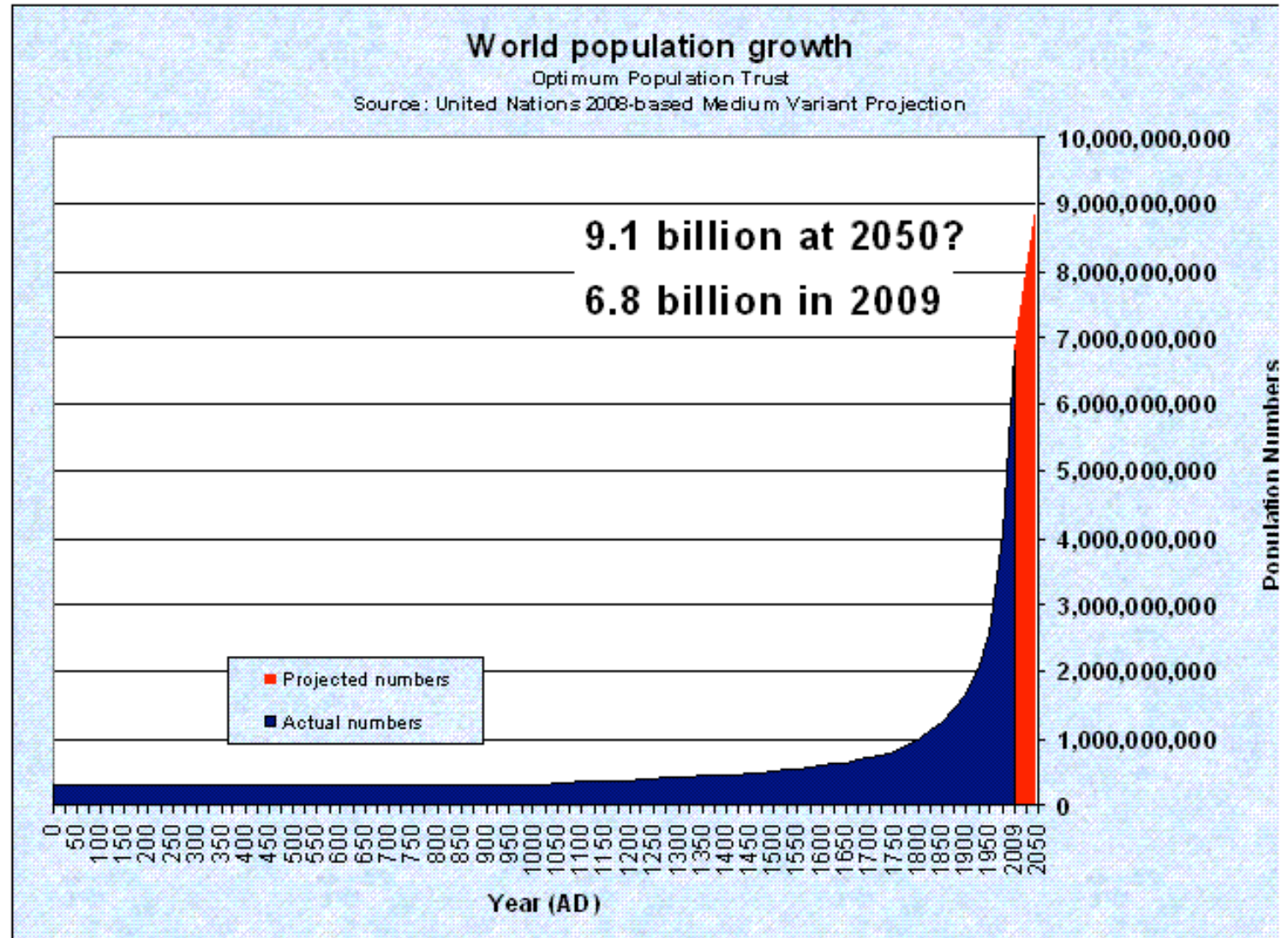
The CO<sub>2</sub> acts like a blanket (**greenhouse effect**).  
So, the atmosphere is warming up:

**Total** emission = **population** x emission per person



# Population growth

<b>1AD</b>	<b>0.3b</b>
<b>1650</b>	<b>0.5b</b>
<b>1800</b>	<b>1.0b</b>
<b>1927</b>	<b>2.0b</b>
<b>1960</b>	<b>3.0b</b>
<b>1975</b>	<b>4.0b</b>
<b>1987</b>	<b>5.0b</b>
<b>1998</b>	<b>6.0b</b>
<b>2011</b>	<b>7.0b</b>

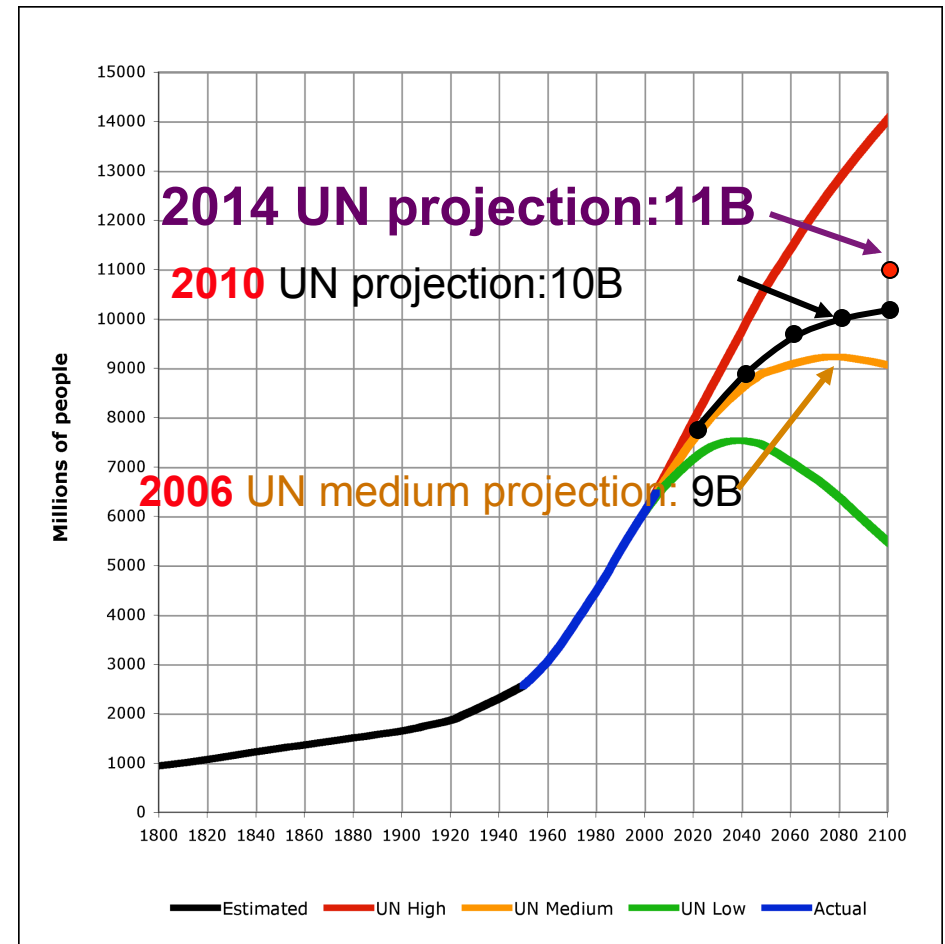




# Population and climate: a study at the London School of Economics

Total emission = population x  
emission per person

Per dollar spent,  
**family planning** reduces  
**four times** as much  
carbon over the next 40  
years as  
adopting **low-carbon  
technologies**





# Why was the population able to grow so fast since the 1950' s?

Two reasons:

- 1) Sanitation and antibiotics (living longer)
- 2) Use of fossil fuels in agriculture starting in the 1950' s:
  - fertilizers, pesticides, irrigation, mechanization (Green Revolution).

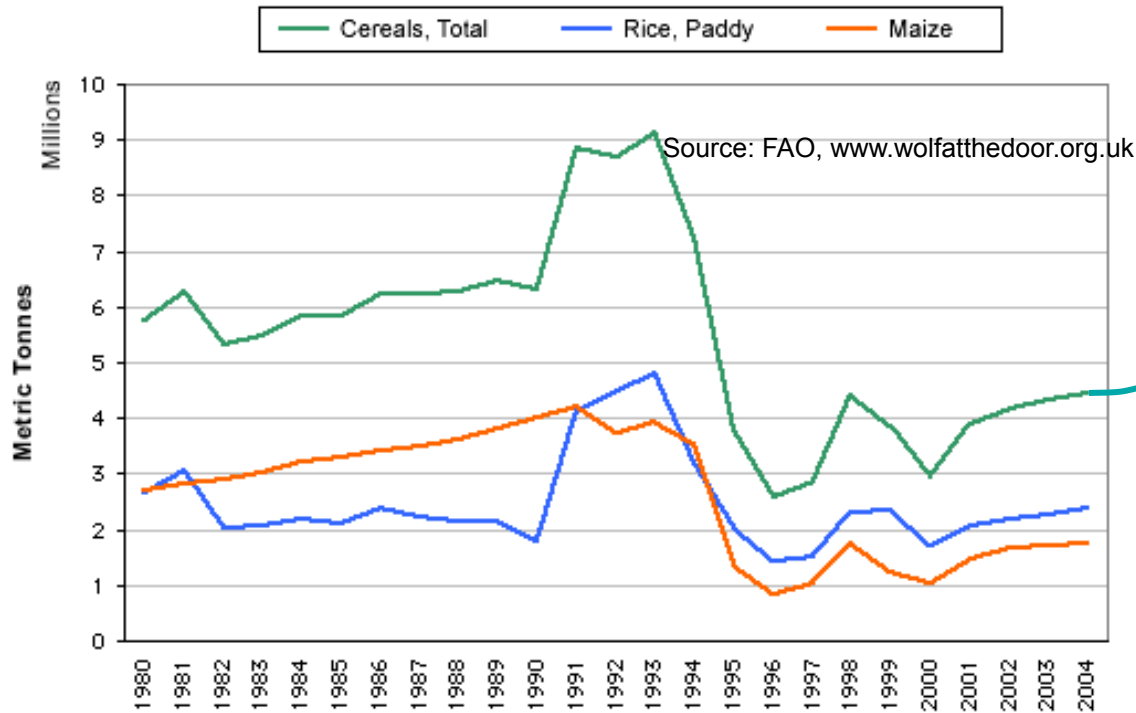
1950 to 1984: production of grains increased by 250% and the population doubled

**Without fossil fuels population would be much smaller!**

- Growth in grain production is now flattening out
- Industrial farming is destroying forests, soil
- Urban and suburban sprawl is overrunning best farmland

**This is not sustainable: “We are drawing down the stock of natural capital as if it was infinite” (Herman Daly)**

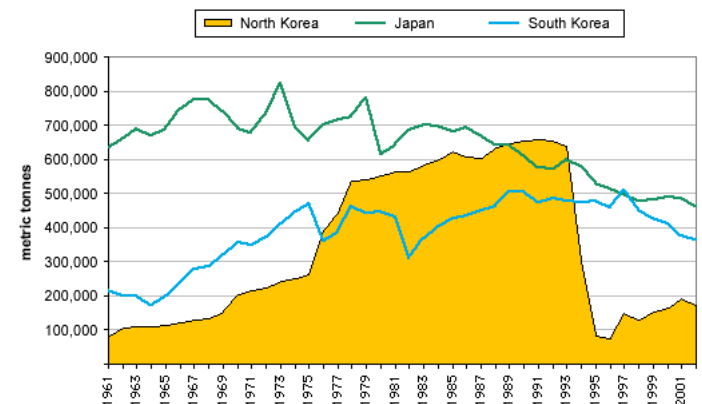
# Example: North Korea, got cheap oil from the former Soviet Union until early 1990s



Production of grain in North Korea, updated to 2008

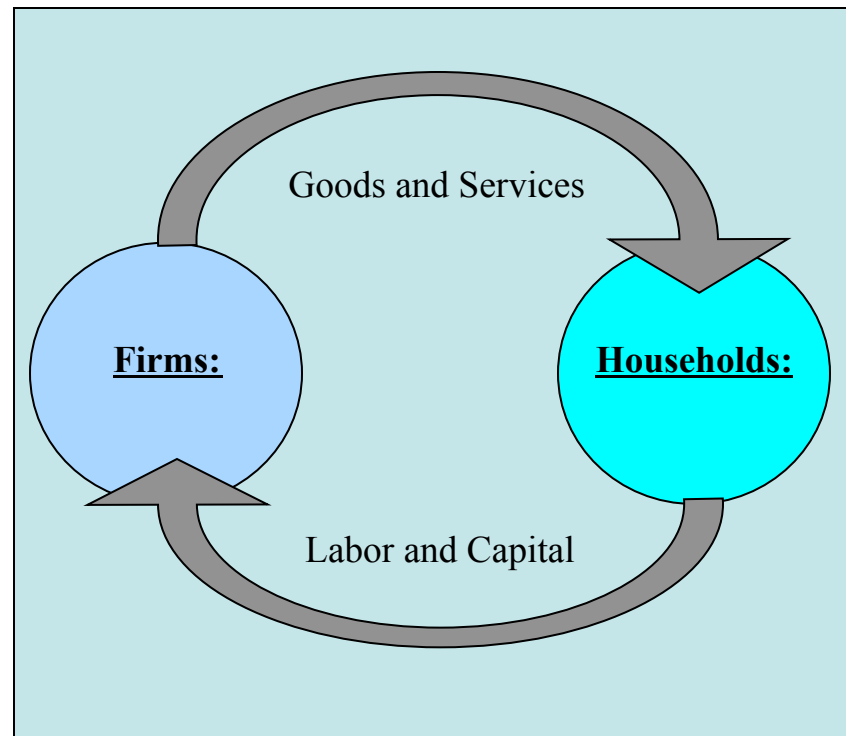
The **famines** in North Korea are the result of the sudden loss of access to abundant fossil fuel

## G2. Fertiliser Use (Nitrogenous) - Far East



# Standard Neoclassical Economic Model

As Herman Daly, Robert Costanza, and other scholars in the field of Ecological Economics describe,



The standard Neoclassical Economic Model does not account for:

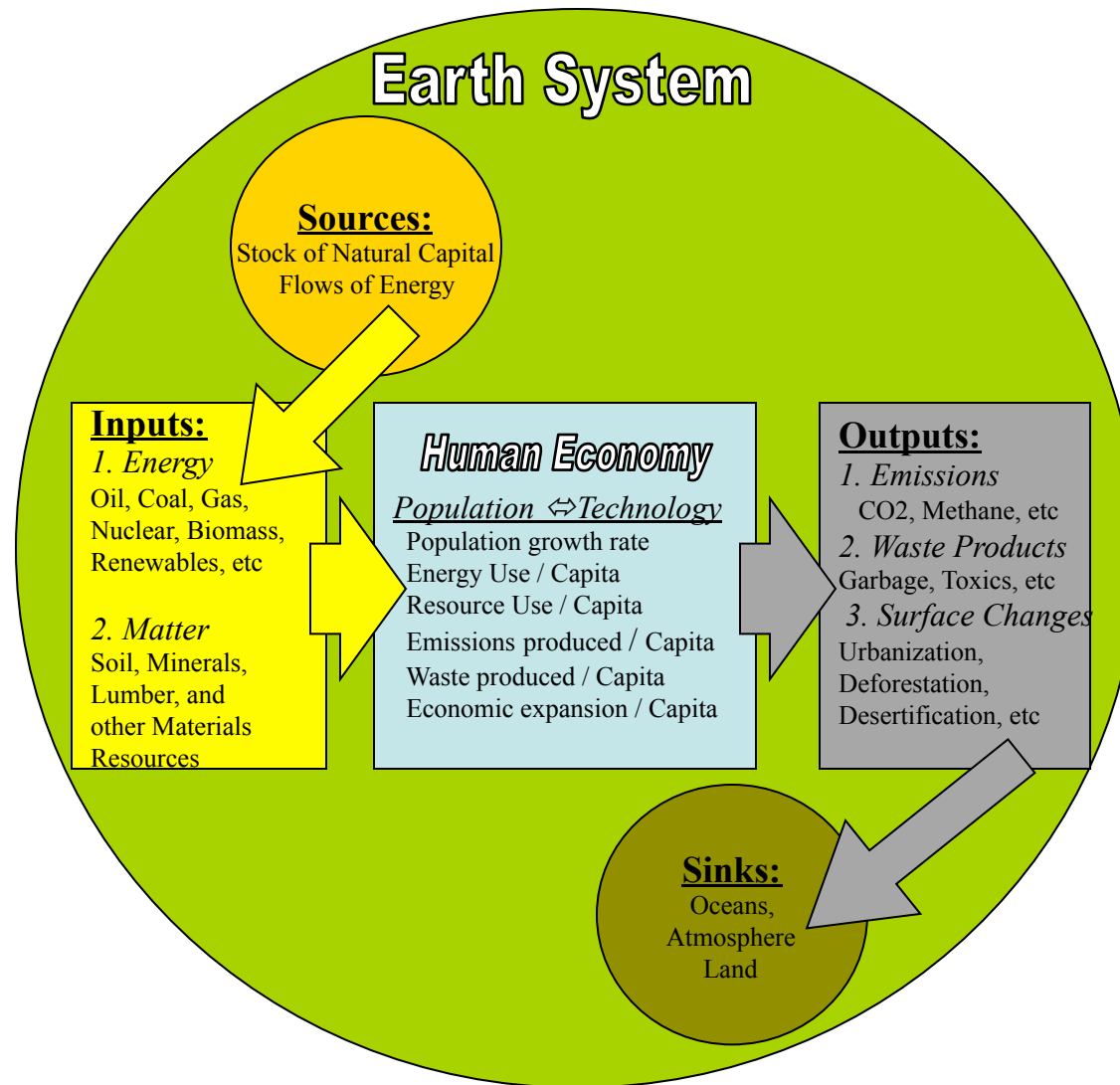
- Inputs (resources), Outputs (pollution), Stocks of Natural Capital
- Dissipation of Energy (i.e., a Perpetual Motion Machine)
- Depletion, Destruction or Transformation of Matter

Therefore, no *effects on the Earth System*, and *No Limits to Growth*.

**Herman Daly (UMD) introduced Ecological Economics,  
within the Earth System**

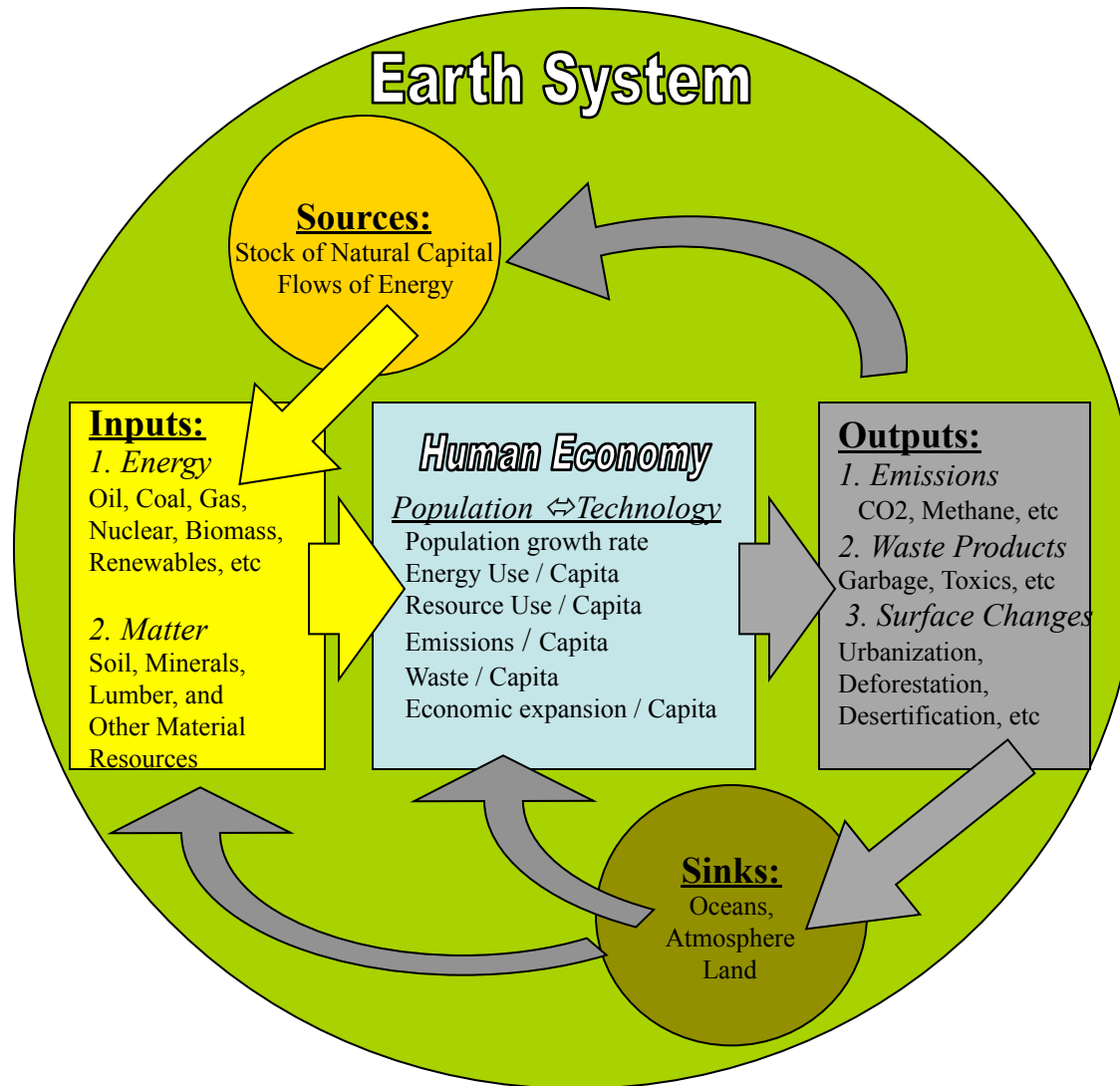
# Realistic **Ecological** Economic Model (Herman Daly)

- Incorporates INPUTS, including **DEPLETION** of **SOURCES**
- Incorporates OUTPUTS, including **POLLUTION** of **SINKS**



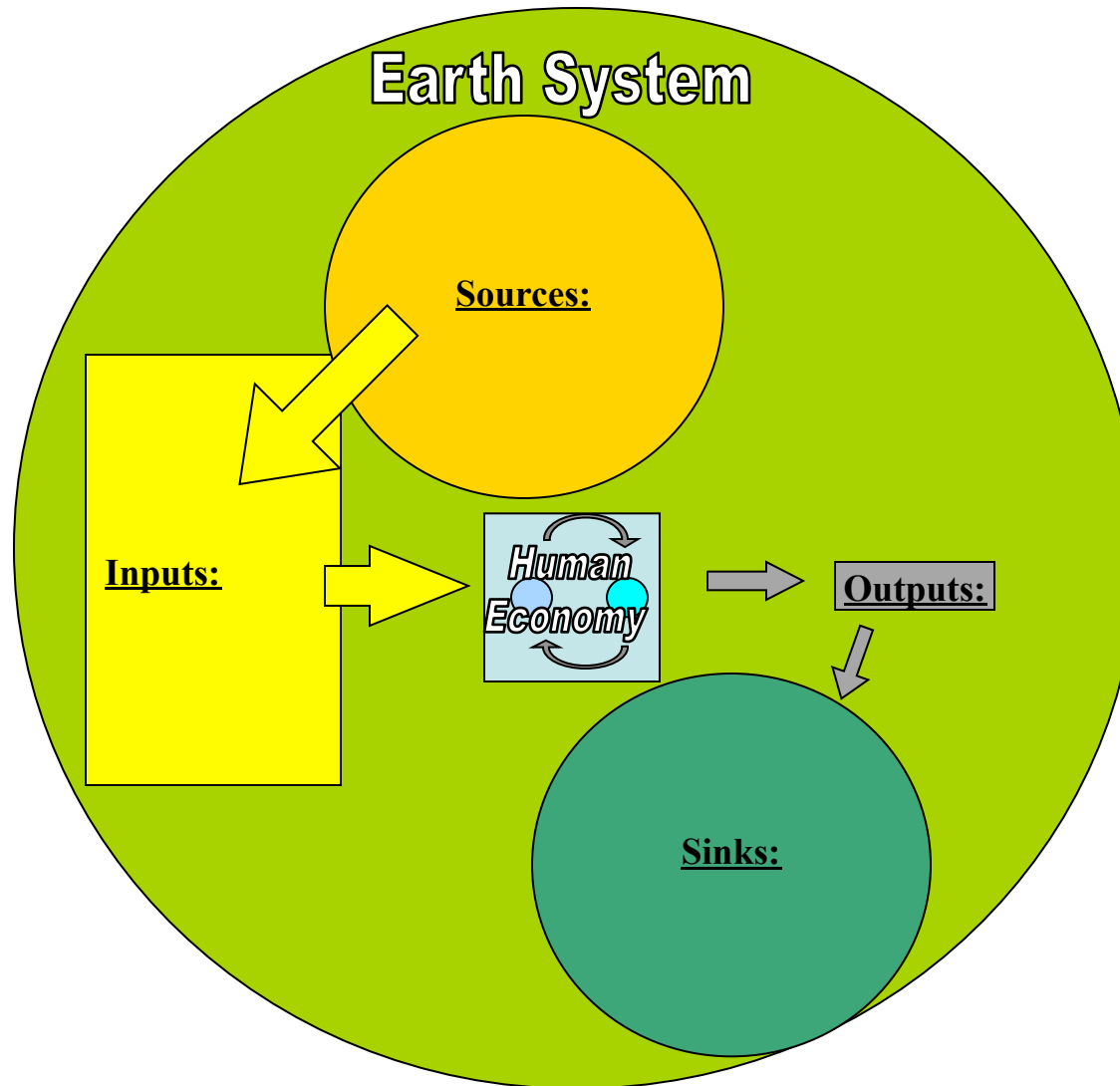
# Feedbacks in an Ecological Economic Model

Of course, the **OUTPUTS** and the **filling up** of **SINKS**, have **feedbacks** on the **Human Economy**, the Quantity and Quality of the **INPUTS**, and the **depletion** of **SOURCES** :

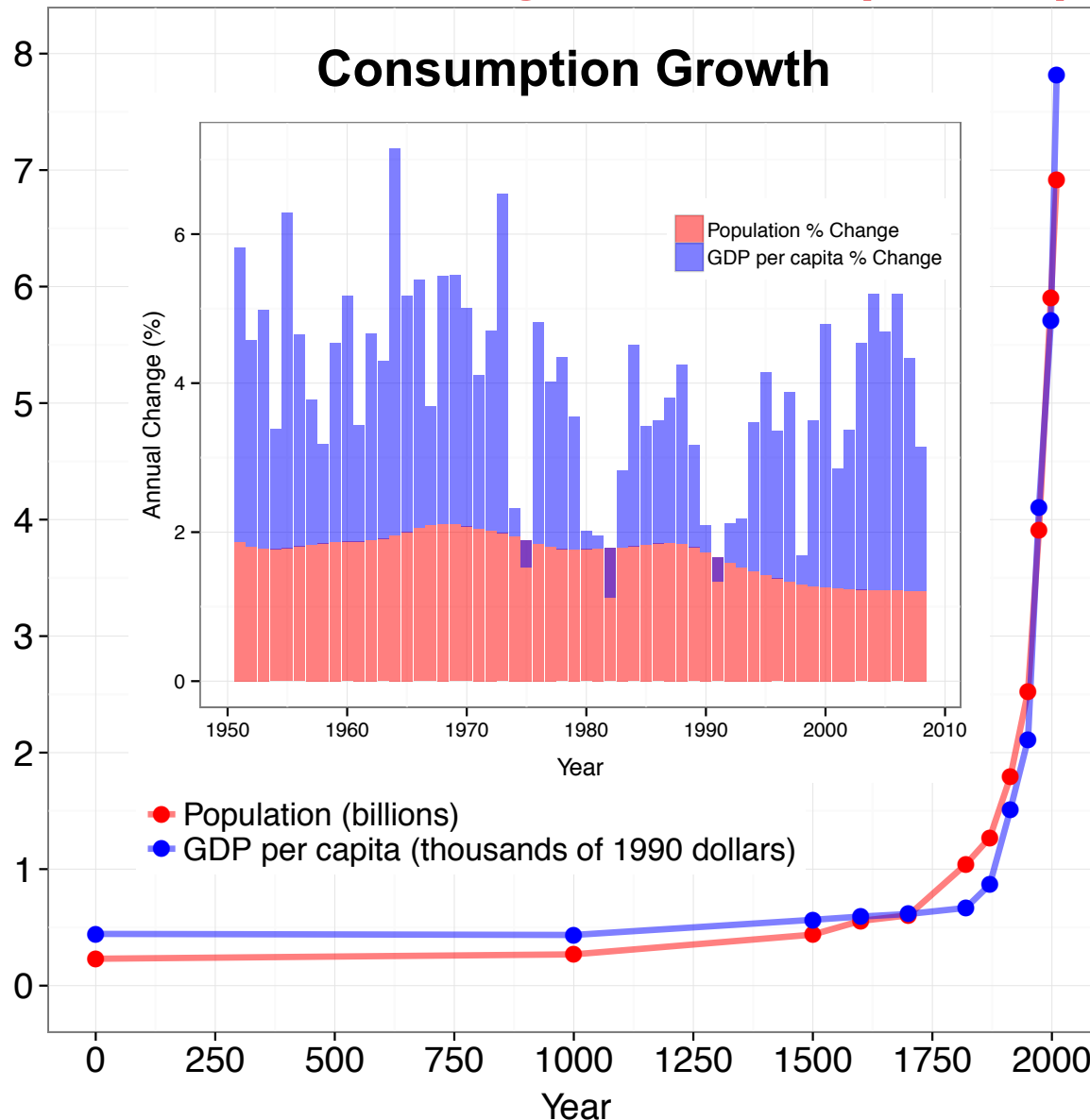


# “Empty World” Model

- Throughout most of human history, the **Human Economy** was so **small** relative to the **Earth System**, that it had little impact on the **Sources** and **Sinks**.
- In this scenario, the standard isolated economic model might have made sense.



# Population and GDP per capita: explosion is very recent (1950)



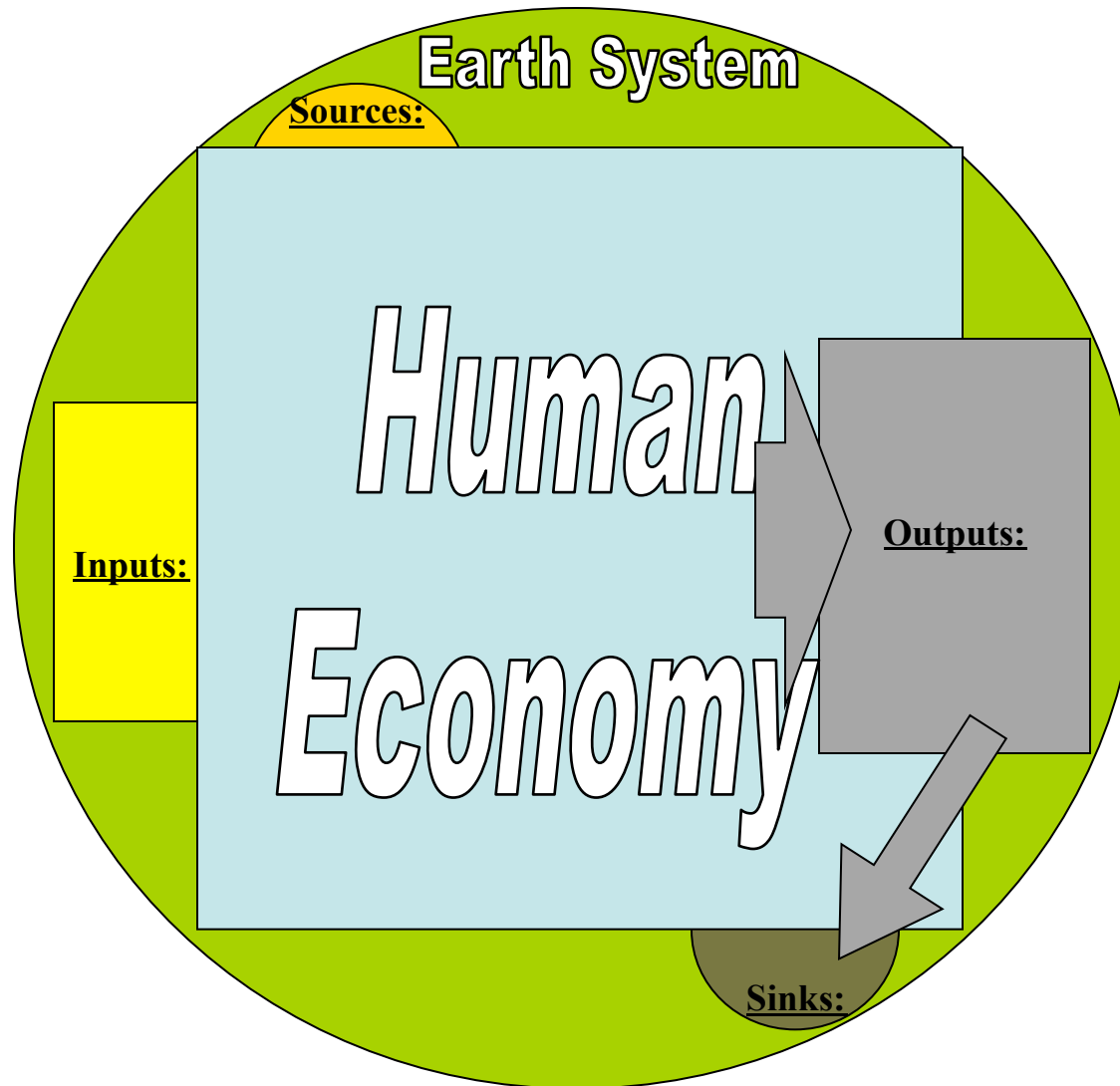
Consumption is growing  
~2% population  
~2% GDP/cap  
  
~4% per year!

**Since 1950,  
we double our total  
consumption  
every 17-20 years!**

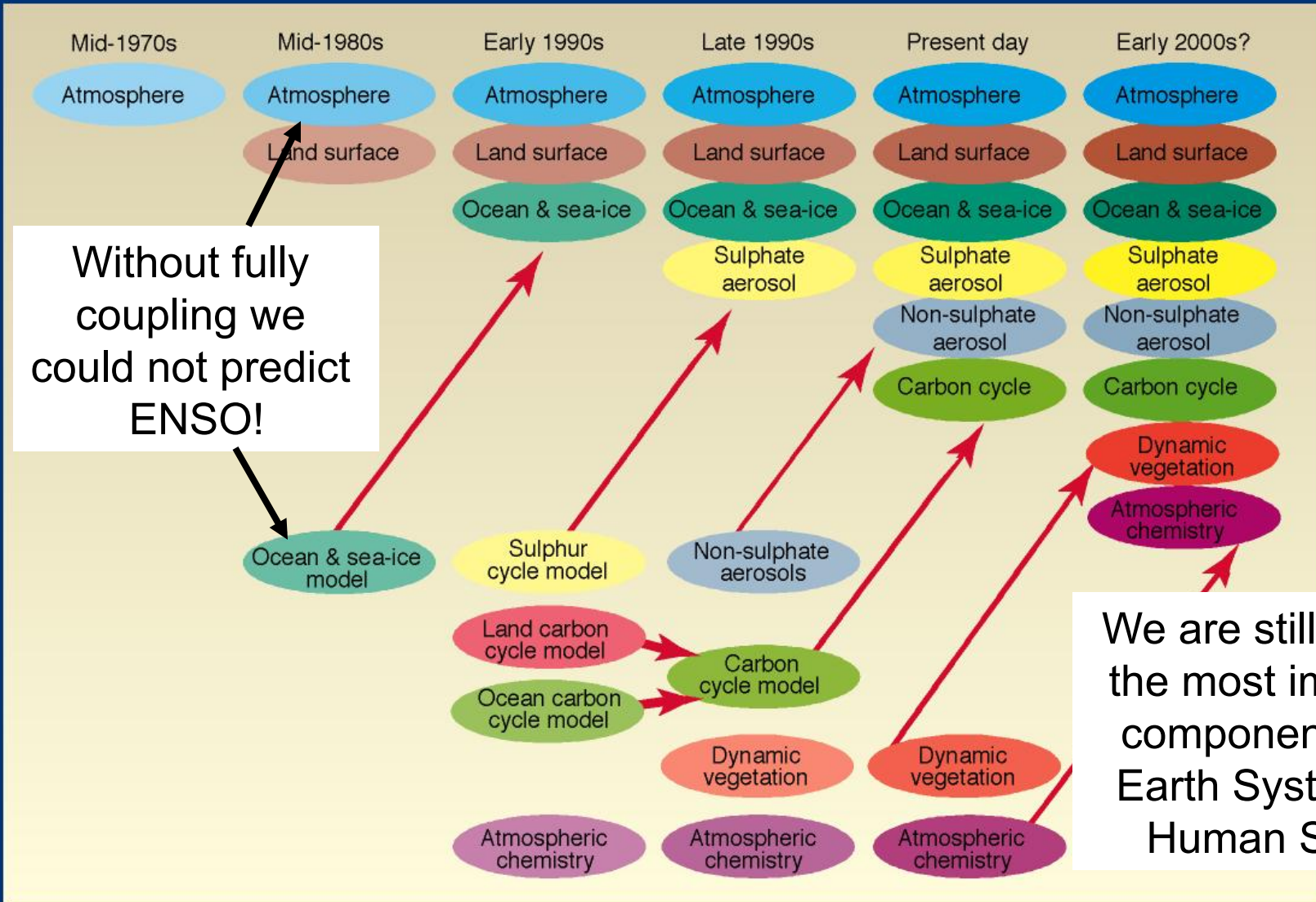


## “Full World” Ecological Economic Model

- Today, the **Human Economy** has grown so large, it has very large **Effects** on the **Earth System**, **Depleting** the **Sources** and **Filling** the **Sinks**. It is clear that **growth cannot continue forever**.



# The development of climate models, past, present and future



WGI-15 BC  
FIGURE 1

IPCC and IAMs DO NOT FULLY COUPLE THE HUMAN AND EARTH SYSTEMS  
POPULATION IS OBTAINED FROM UN PROJECTIONS!

# Schematic of Earth System - Human System Feedbacks

## Earth System

## Human System (Region n)

**Effects and Feedbacks**

- Policies →
- Population →
- Pollution →
- Others →

### Policies

**Global Atmosphere**  
Temp, Wind, Fluxes, Rain, CO2

**Land (Region n)**

Land-Vegetation Model  
Leaf, root, wood, soil carbon pools

Land-Use Model

**Forest**

**Grassland**

**Desert**

**Biodiversity and Species Loss**

**Water (Region n)**  
Oceans, Rivers, Lakes, Aquifers, Glaciers, Arctic Ice

**Ecosystem Fragmentation & Degradation**

**Crop-land and Grazing land**

**Urban Areas**

**Precip. & Evap.**

**River Routing Module**

**Surface Water**

**Ground Water**

**Recharge**

**Desalination**

**Waste Emissions**

**Energy**  
Non-Renewable  
Renewable  
Regenerating

**Industry**

**Agri-culture**

**Food**

**Fresh Water Supply**

**Fisheries**

**Waste Water Pollution**

**Recycling**

**Trade**

**Inequality**

**Migration**

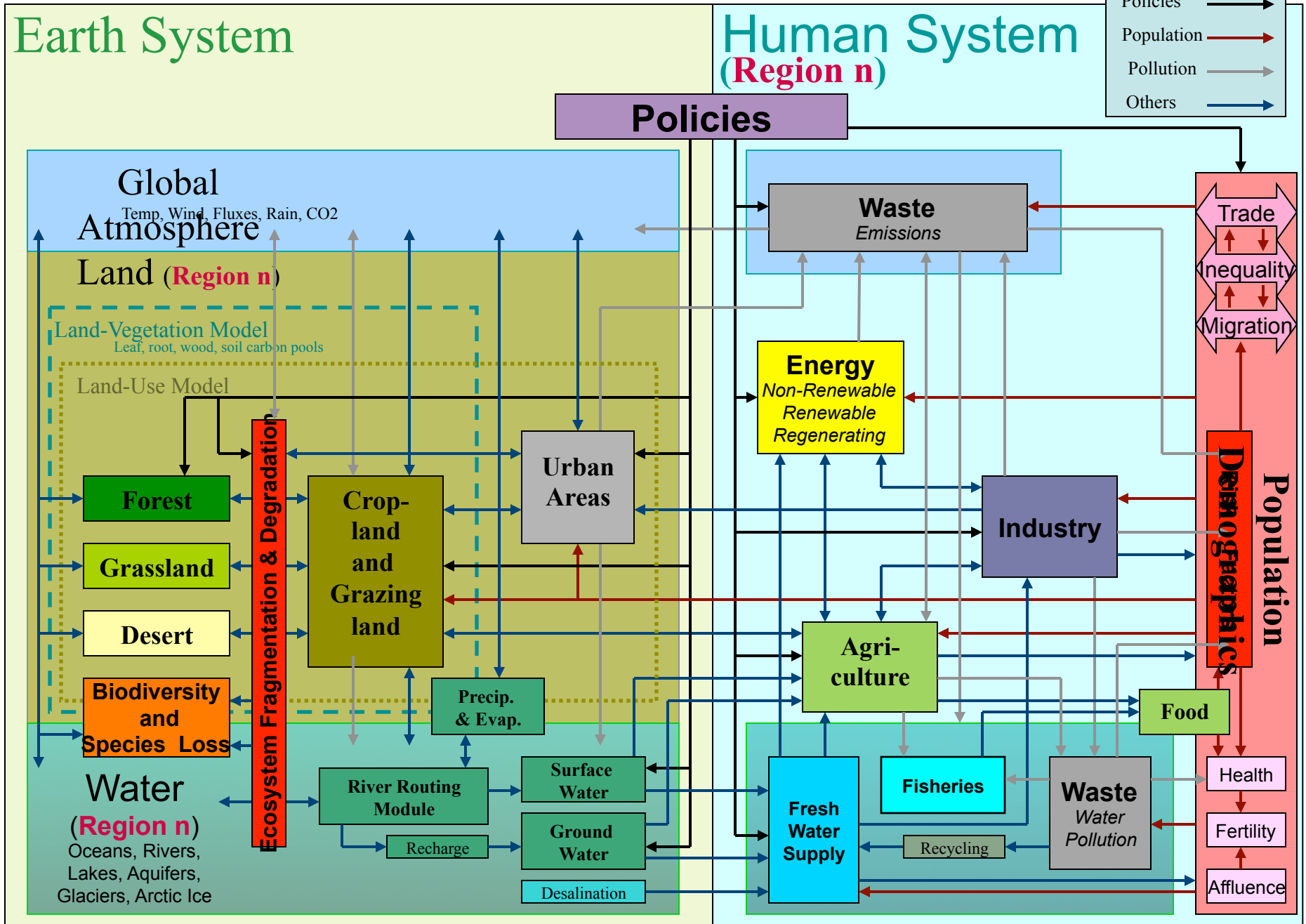
**Demographics**

**Population**

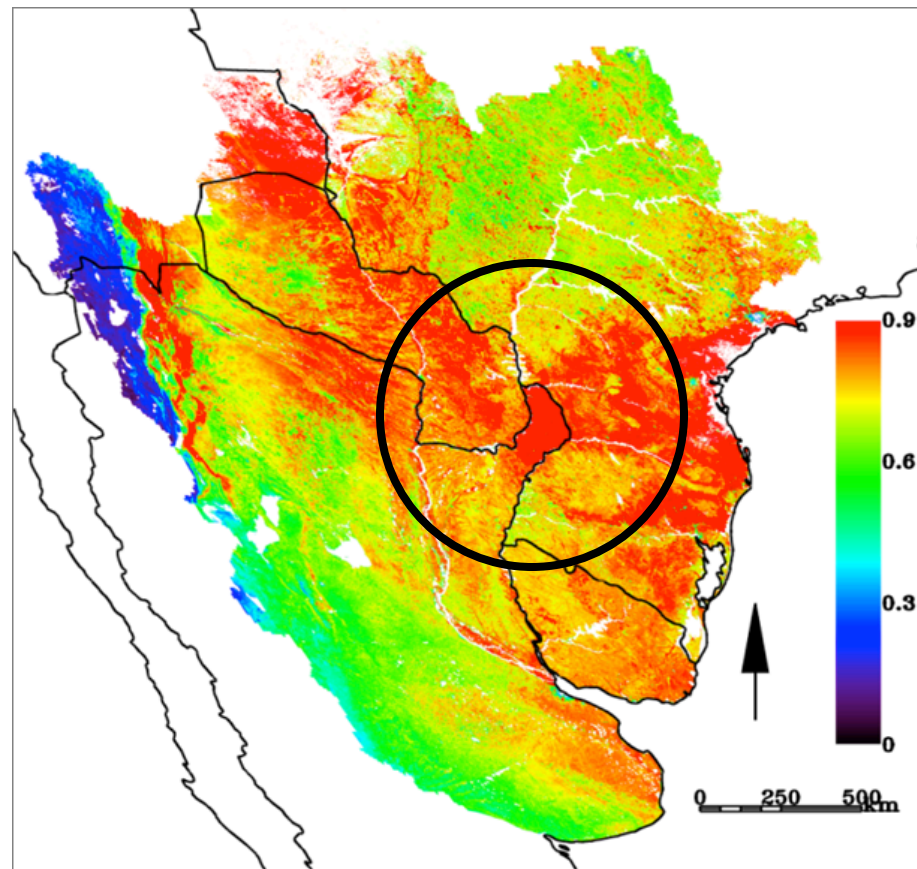
**Health**

**Fertility**

**Affluence**



# Policies: Can we use nature sustainably?



The red (highest NDVI **vegetation index**) is in the **province of Misiones**, Argentina, that **protects the forest**.  
Compare Misiones with Brazil, Paraguay and the rest of Argentina!

# Could an advanced society like ours **collapse**?

- **Collapses of many advanced societies** have taken place in the last 5000 years!
- A recent study of the many collapses that took place in Europe (Neolithic, -10K to -4K) has excluded climate forcing, war, and disease as the root cause of such collapses, so that it concluded:
- The collapses were due to overrunning the Carrying Capacity
- We developed a “Human and Nature Dynamical model” (HANDY) to start understanding the nonlinear feedbacks between the Earth and the Human System.

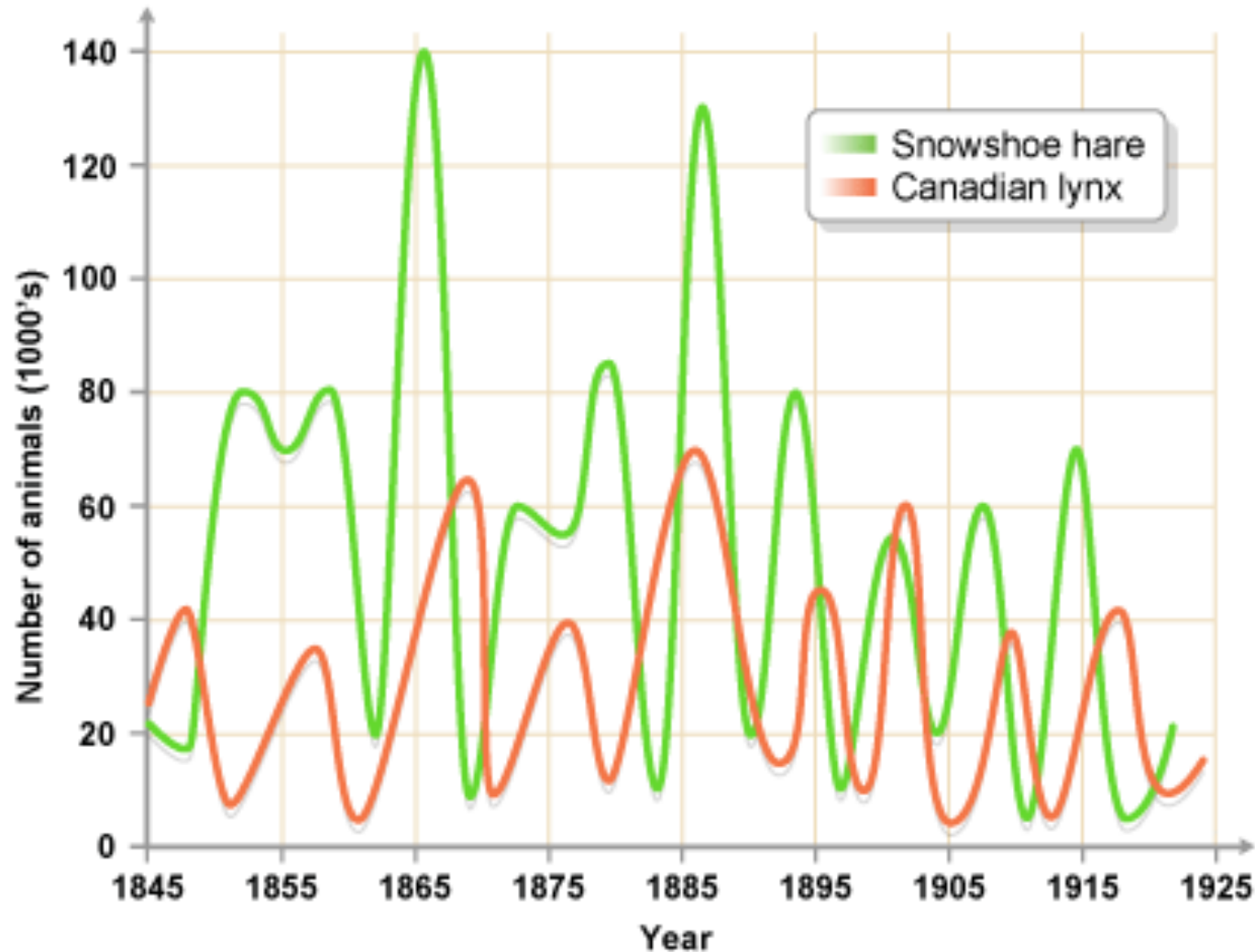
# Exploring the Dynamics producing Historical Cycles of Rise and Collapse

---

- There are widespread concerns that current trends in resource-use (growth in depletion *and* pollution) are unsustainable.
- But our understandings of
  - Long-Term Sustainability
  - and of
  - Overshoot and Collapse
- Remain under-theorized *AND* controversial



# Oscillations with Overshoots and Collapses are common in Natural Systems (like the Predator and Prey model)





# But do they occur in Human Systems?

- It is popularly believed that Human History has been **a continuous and inevitable upward trend in levels of**
  - population and
  - prosperity.
- However, the **Historical Record** is closer to the **Oscillations found in Nature**.
- **Cycles of Rise and Collapse** occurred **frequently in history**,
- often involving **centuries of decline** (population, economic, and intellectual).

# Review of Some Historical Collapses

- **Collapse of the Roman Empire**
  - Well known, but not the first rise and collapse in Europe.
- **Minoan Civilization**
- **Mycenaean Civilization** – Complete and Total Collapse (in Greece, 2K BC)
  - Population dropped by an order of magnitude,
  - Urban areas abandoned,
  - Literacy completely lost
  - Recovery took **4 to 5 centuries**

# History is also full of *Cycles* of Rise and Decline

- **Mesopotamian History:**

- the Sumerians, the Akkadians, Assyrians, Babylonians, Achaemenids, Seleucids, Parthians, Sassanids, Umayyads, and Abbasids.

- **Egyptian History,**

- Three distinct cycles of Rise And Collapse in Ancient Egypt:
- More Cycles after Egypt was conquered by the Persians, Greeks, Romans, Arabs, Turks, and British

- **Chinese History**

- Zhou, Han, Song, Ming, & Ching Empires
- all were followed by a decline or a collapse.

- **Indian History:**

- Indus Valley Civilization, Mauryan Empire, Gupta Empire, A Dark Ages, Empire under Harsha. Finally by many Foreign Conquests by Arabs, Moguls, British

# Collapses Not Restricted to the “Old World”

- Collapse of **Maya Civilization** in the Yucatan
  - One of the best-known cases
  - Partly because of the Depth of the Collapse
    - As Diamond [2005] puts it,  
“the disappearance of between 90 and 99% of the Maya population after A.D.800.”
- **Other Rise and Collapse Cycles in Mesoamerica:**
- **Central Mexico:**
  - The Olmecs, The Toltecs, Teotihuacan (the sixth largest city in the world in the 7th C), Monte Alban

## Many others examples from around the World:

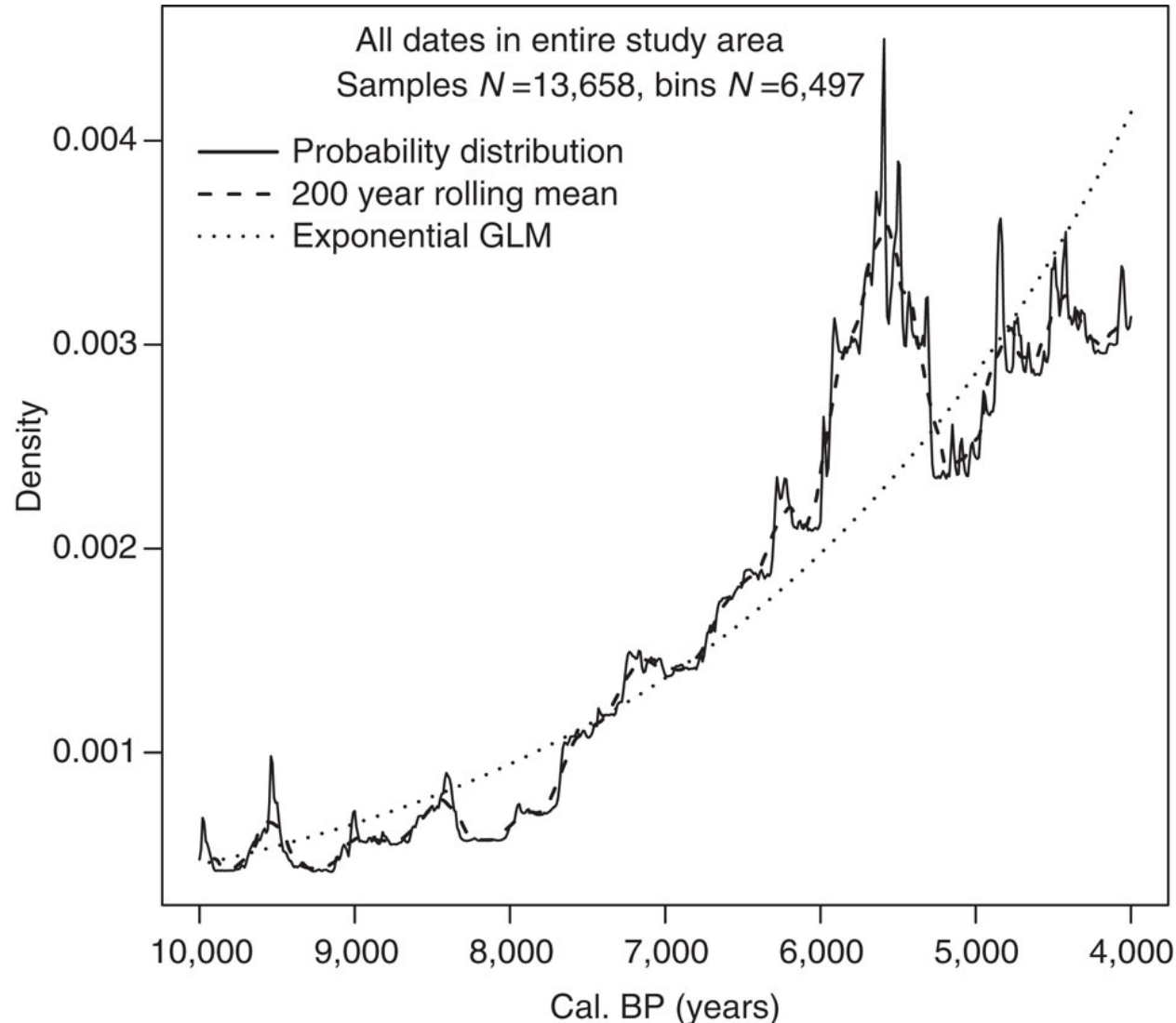
- **Mississippi Valley Cultures** such as:
  - Cahokia,
  - The Hopewell Complex
- **South West US Cultures** such as
  - The Pueblo and
  - The Hohokam,
- **Andean Civilizations** such as
  - Huari, Tiwanaku,
- **Sub-Saharan African Civilizations** such as Great Zimbabwe, and
- Collapses in **the Pacific Islands**,
  - Easter Island is the most well known.

# Cycles also occurred in early non-stratified Neolithic Societies

---

- A recent study [Shennan et al., 2013] of **Neolithic Europe** found:
  - “in contrast to the steady population growth usually assumed, the introduction of agriculture into Europe was followed by
    - **a boom-and-bust pattern in the density of regional populations**”.
- Multiple Cycles:
  - “most regions show **more than one boom-bust pattern**”

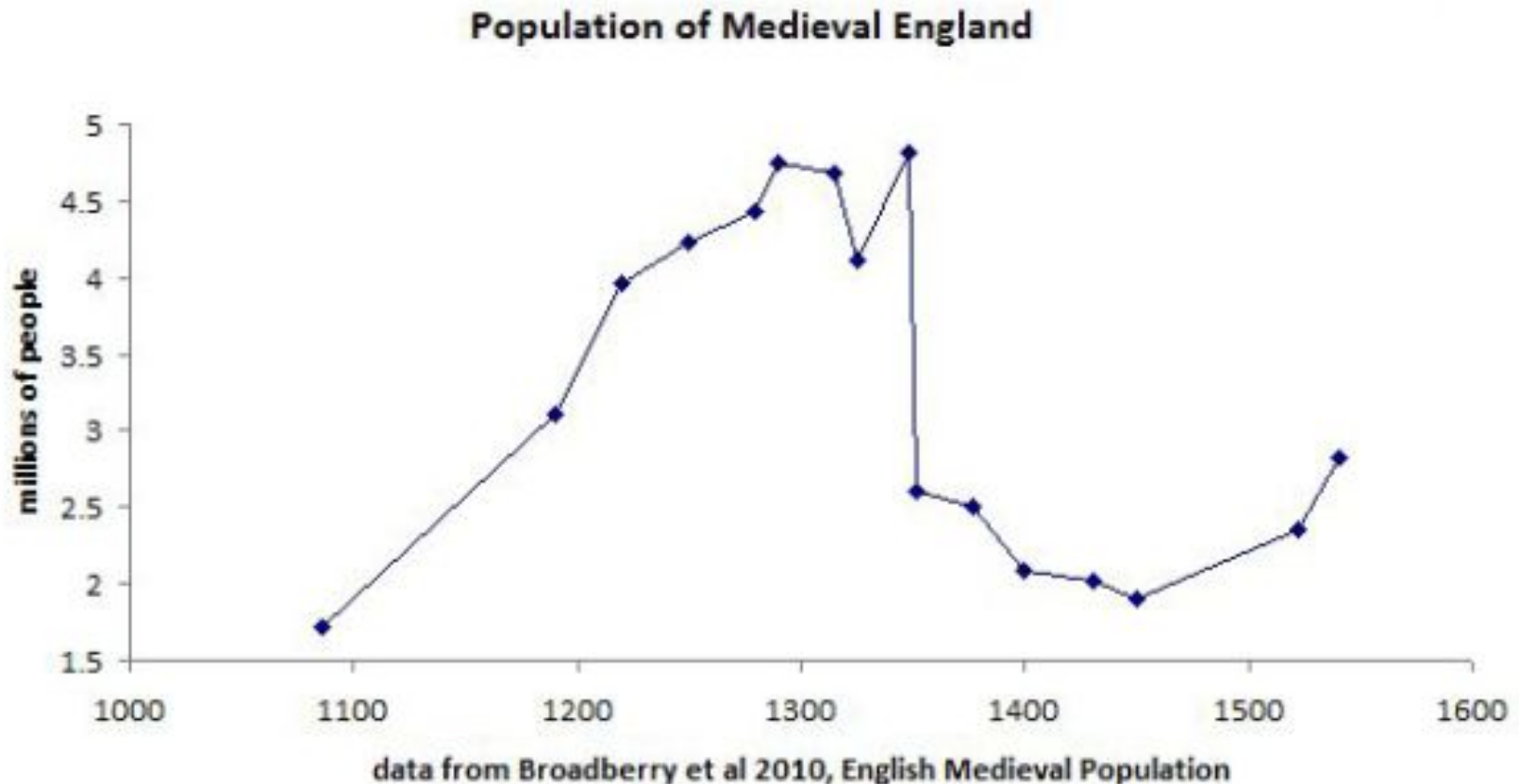
# Neolithic Population (all of Western Europe)



**Population Density change 10,000–4,000 BP**  
using all radiocarbon dates in the western Europe  
(SCRPD) summed calibrated radiocarbon date density

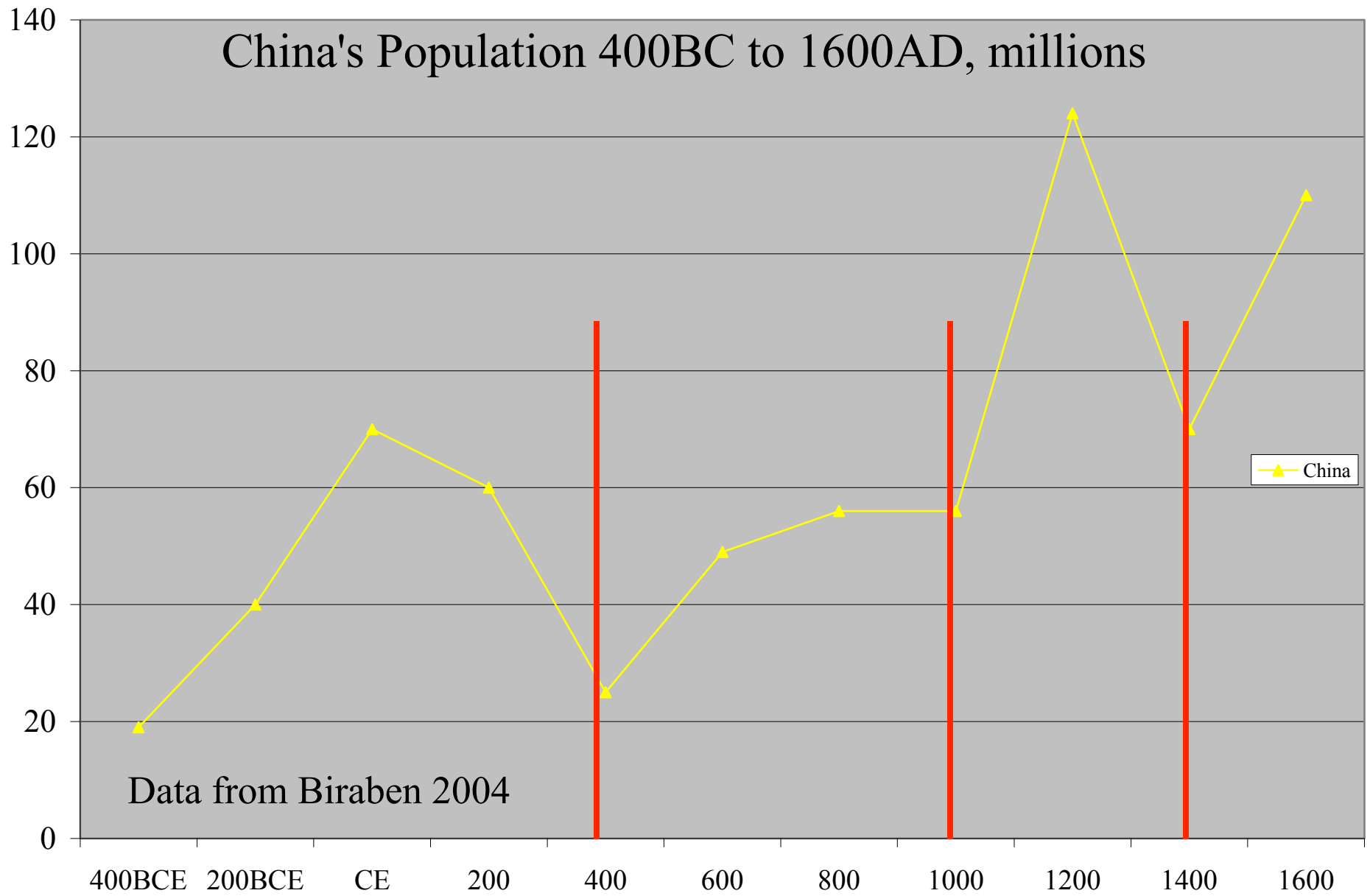


# The European Medieval Demographic Collapse:



These relatively precise estimates provides us with a good example of a rise and collapse cycle.

# China's Population 400BC to 1600AD, millions



Data from Biraben 2004

## In sum:

Cycles of rise and collapse are common across different Regions, Time Periods, and levels of Technological Development

- Tainter [1988]
  - The “picture that emerges is of **a process recurrent in history, and global in its distribution**”
- Turchin and Nefedov [2009]:
  - “**demographic-social-political oscillations of a very long period (centuries long) are the rule, rather than an exception....**”

# Human and Nature Dynamics Model (HANDY)

We built a Human Population Dynamics Model by starting with a Standard Population Model In Biology (“predator–prey”),

And adding two Properties found in Human Populations:

(1) Accumulated Surplus (wealth) and

(2) Economic Inequality

to investigate Potential Mechanisms that can explain these cycles found in the historical record.

# Human and Nature Dynamical model (HANDY) with Rich and Poor: for thought experiments

Just 4 equations!

Total population: **Elite** + **Commoners**  $x = x_E + x_C$

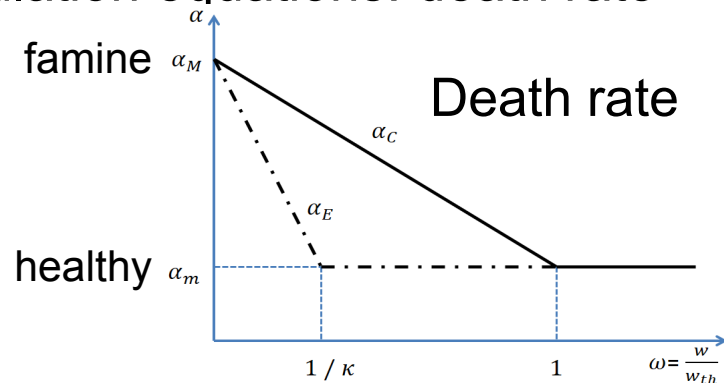
Nature equation: **Logistic Regeneration** – **Production by Commoners**:

$$\dot{y} = \text{Regeneration } \gamma y(\lambda - y) - \text{Production } \delta x_C y$$

**Wealth** is managed by the Elites. Inequality factor  $\kappa \sim 100$

$$\dot{W} = \text{Production} - \text{Commoner consumption} - \text{Elite consumption} = \delta x_C y - s x_C - \kappa s x_E$$

Population equations: death rate  $\alpha$  depends on whether there is enough food:

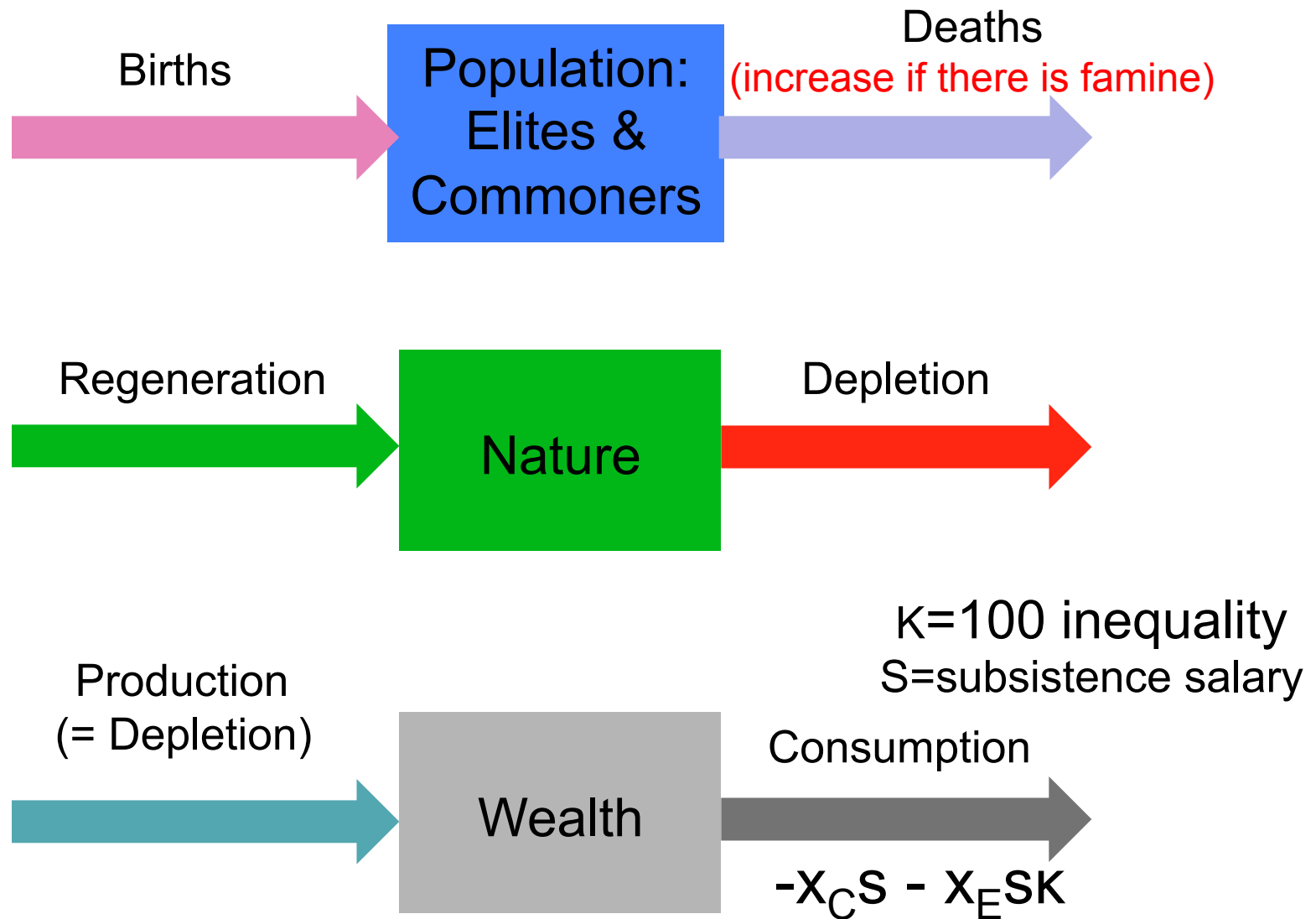


$$\dot{x}_C = -\alpha_C x_C + \beta_C x_C$$

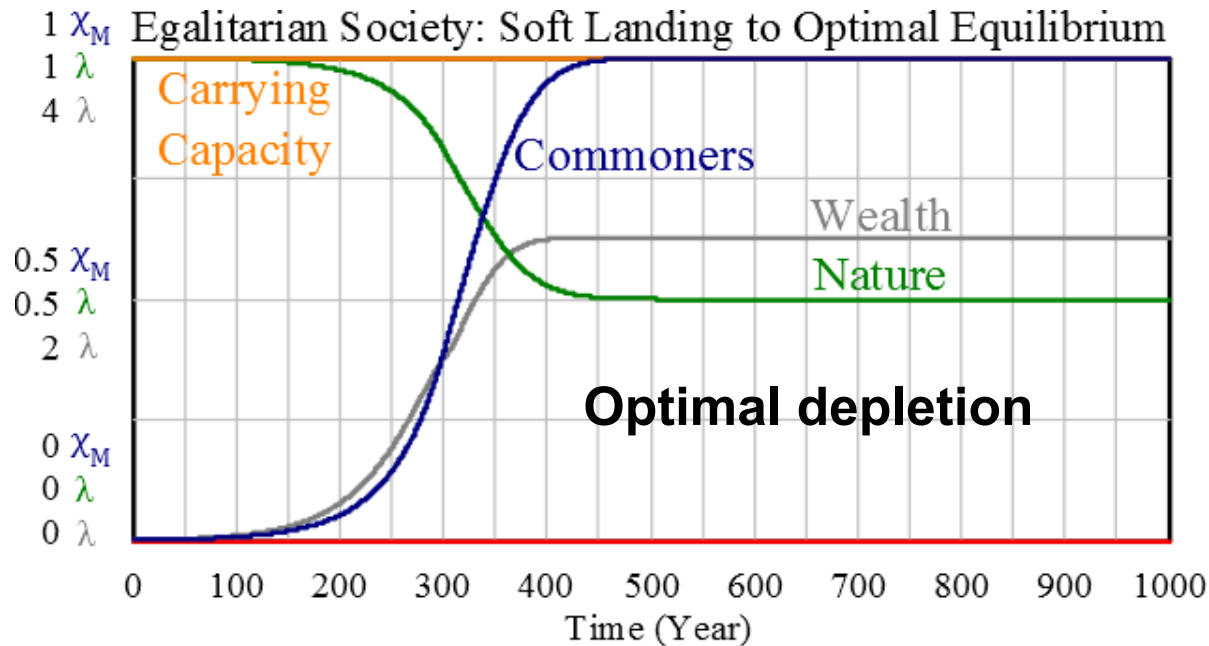
$$\dot{x}_E = -\alpha_E x_E + \beta_E x_E$$

The **rich Elite** accumulates wealth from the work of everyone else (here referred to as the **Commoners**). When there is a crisis (e.g., famine) the Elite can spend the accumulated wealth to buy food and survive longer.

# State Variables (Stocks) and Flows in HANDY1



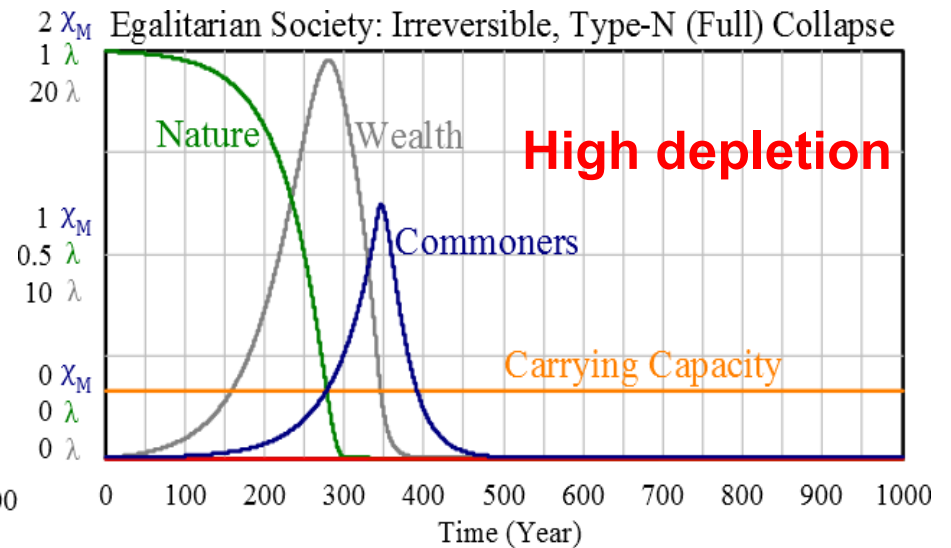
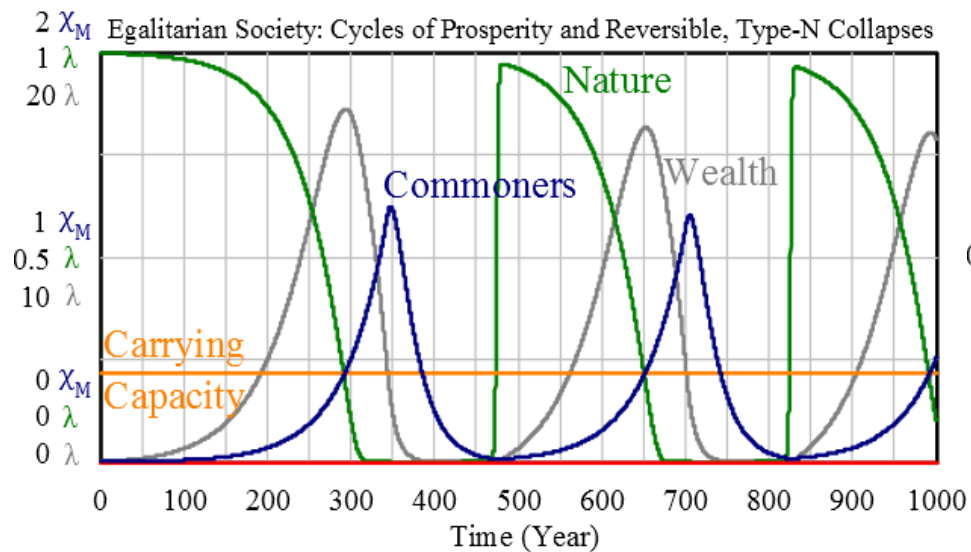
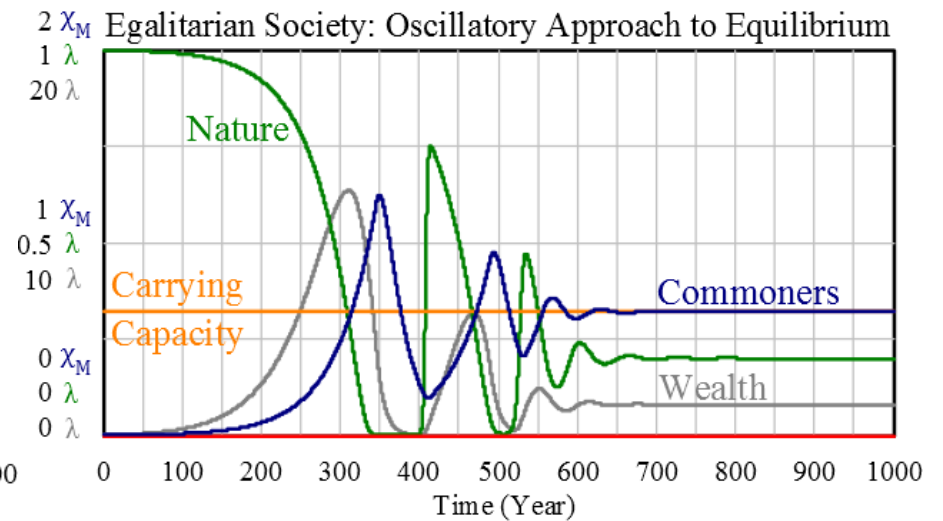
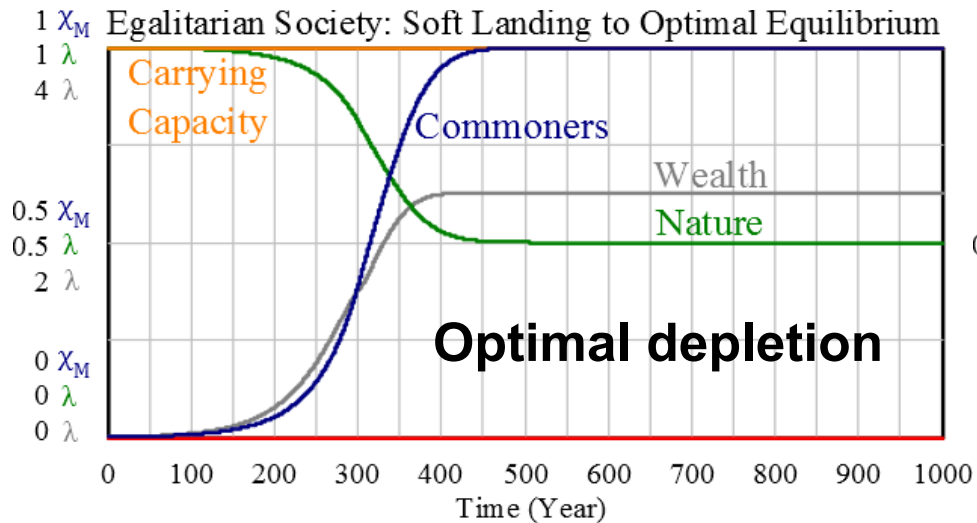
# Experiments for an Egalitarian Society (K=1)



With optimal depletion an egalitarian society reaches equilibrium at the maximum Carrying Capacity

What happens if we increase the **depletion per capita**?

# Experiments for an Egalitarian Society (K=1)

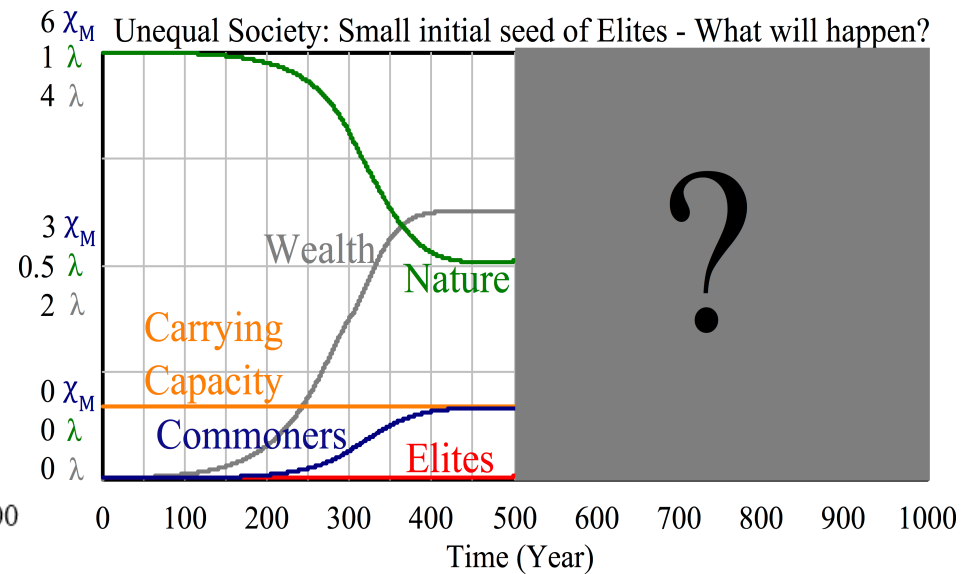
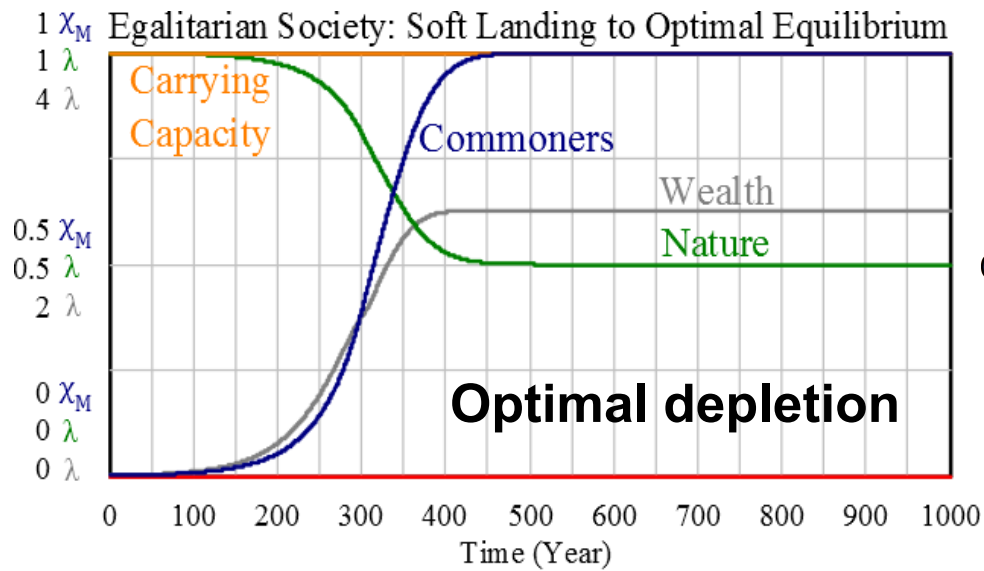


**High depletion** rate leads to collapse: nature cannot regrow



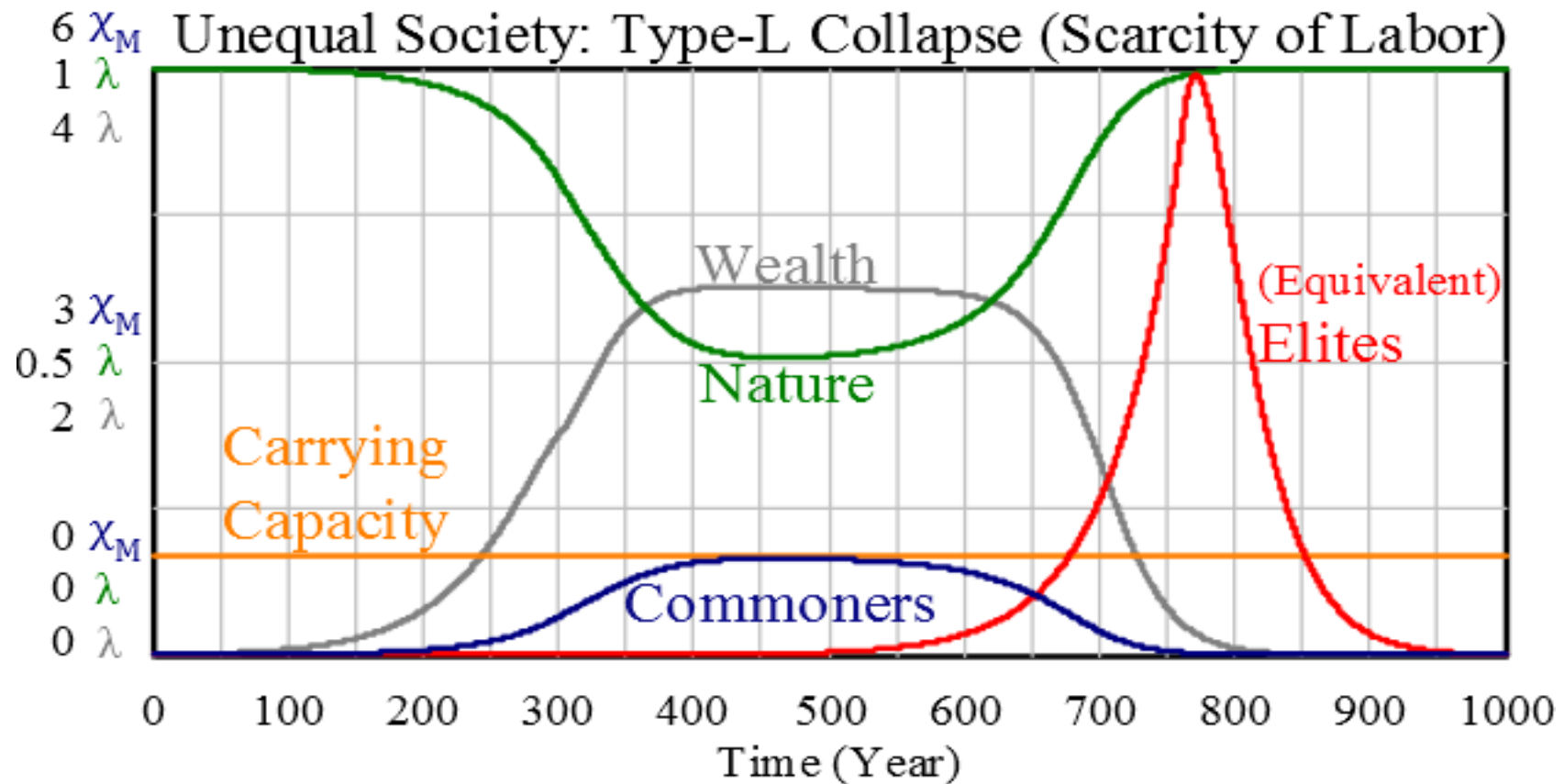
# What happens if we introduce **Inequality**?

## Optimal depletion, but $K=100$

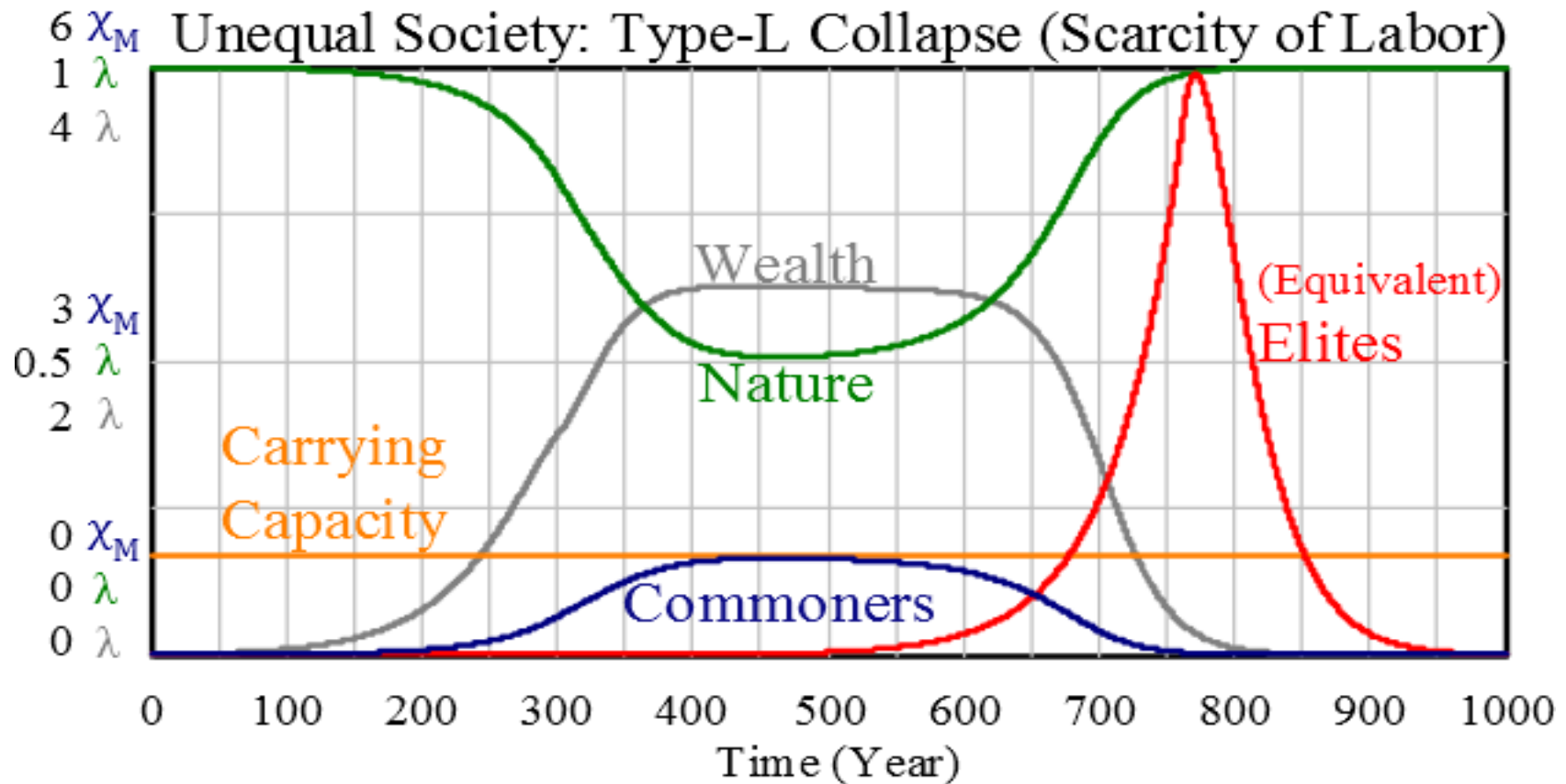


Up until  $t = 500$ ,  
both scenarios show the exact **same** evolution

An otherwise *sustainable* society will collapse if there is high inequality ( $\kappa = 100$ ).

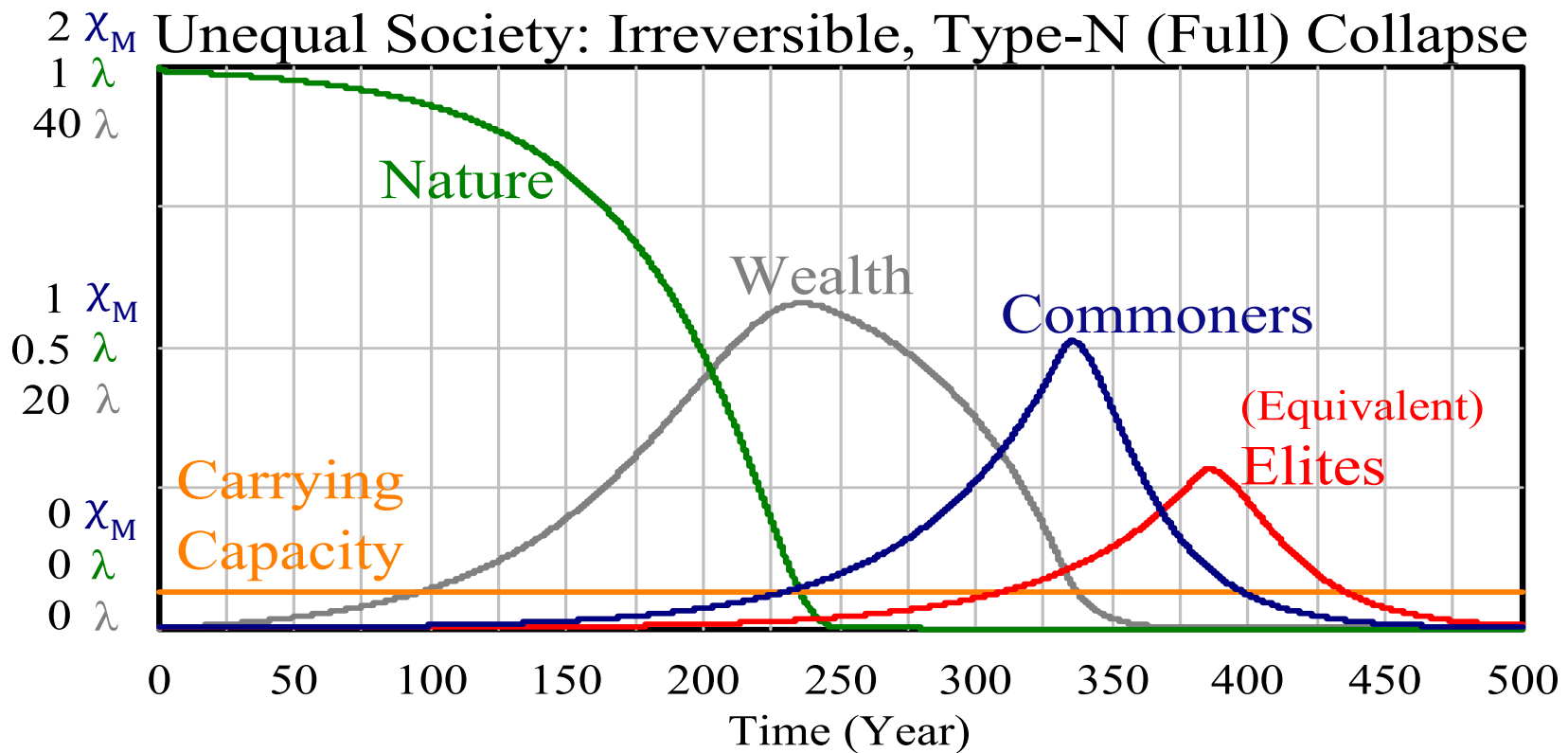


An otherwise *sustainable* society will collapse if there is high inequality ( $\kappa = 100$ ).



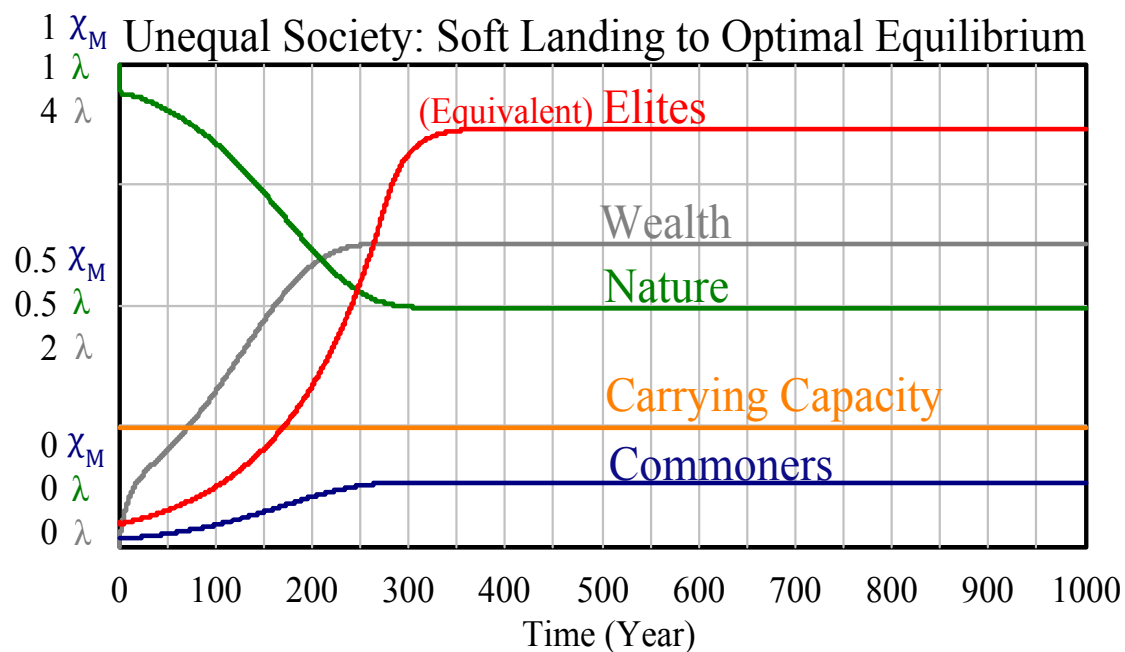
What happens if we have *both* **high inequality** and **high depletion** rate?

# Typical Collapse: High **Depletion Rates** and High **Inequality** at the same time



*Is there any hope for an unequal society to survive?*

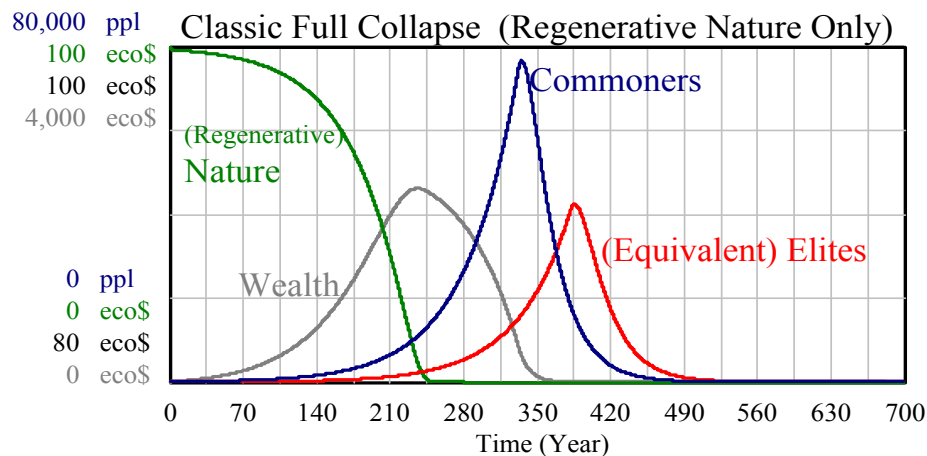
If we reduce the *depletion per capita* and *inequality*, and slow down the *population growth*, it is possible to reach a steady state and survive well.



Reaching this equilibrium requires **changes in policies:**

- Reduce depletion per capita
- Reduce inequality ( $\kappa = 10$ ) (as estimated by Daly)
- Reduce birth rates

# Could a collapse be prevented if we “find” large stocks of Nonrenewable Energy?

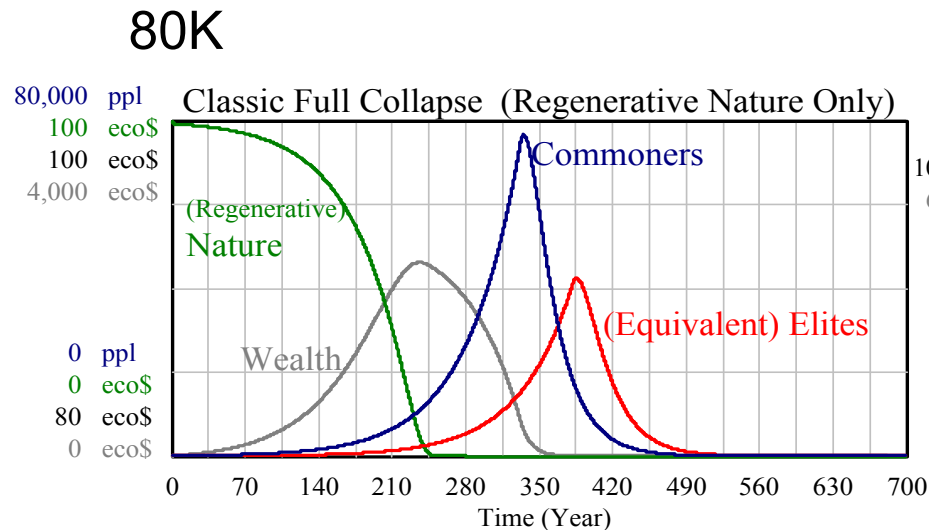


What happens when we add fossil fuels?

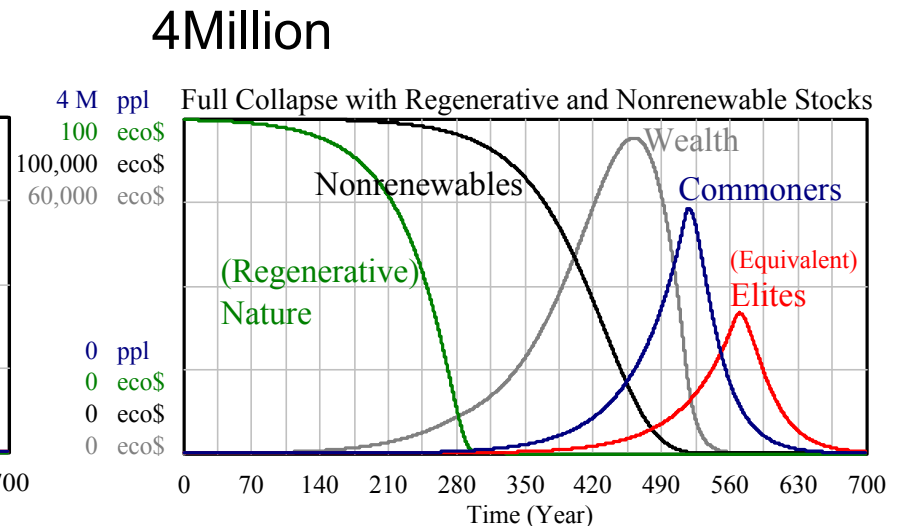
This is the classic HANDY1 full collapse scenario, **with only regenerating Nature**

We then add to the **regenerating Nature** a **nonrenewable Nature**

# Impact of adding fossil fuels (nonrenewable energy resources)



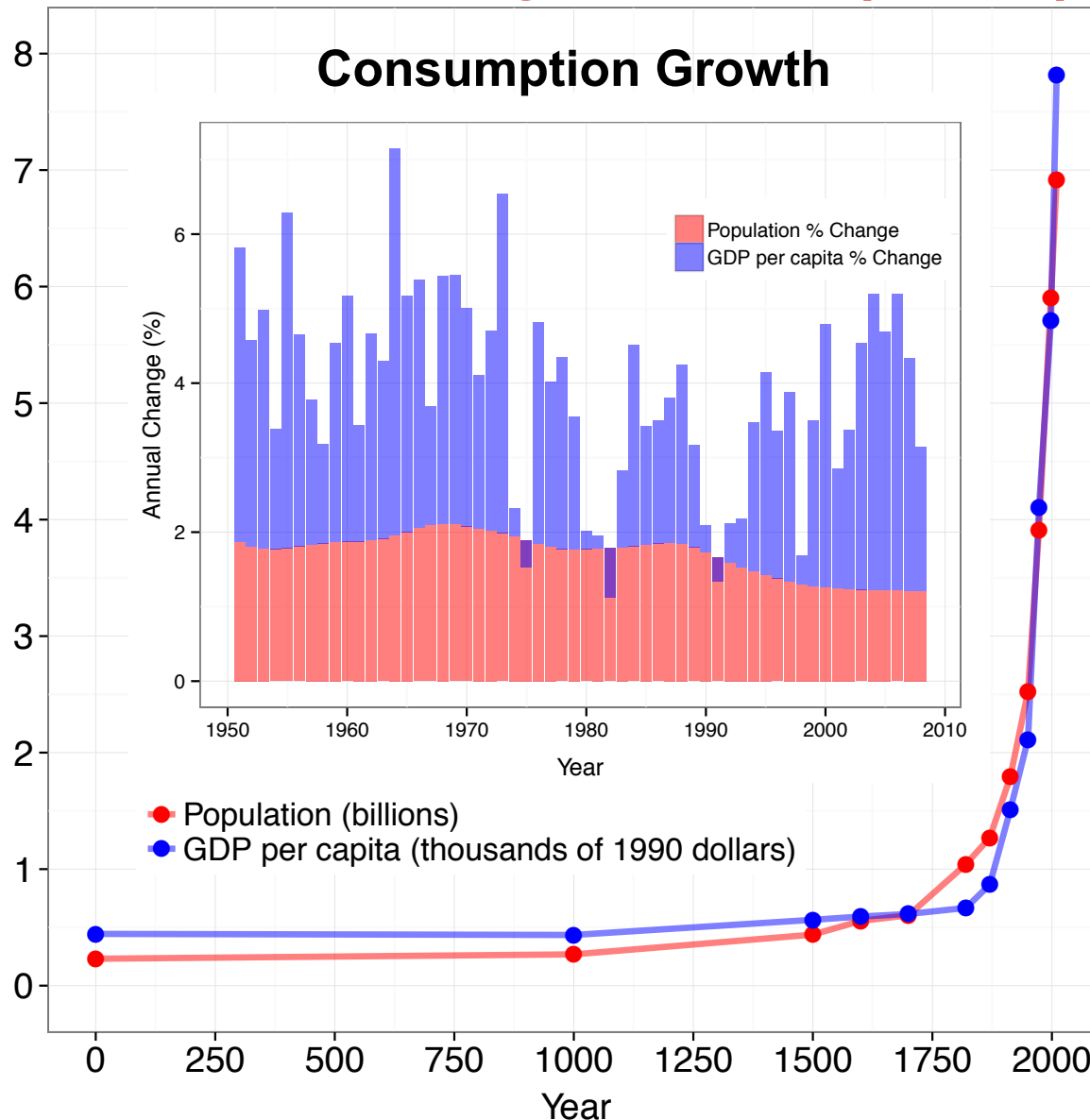
Regenerating Nature Only



Both Regenerating and  
Nonrenewable  
Resources

The collapse is postponed by **~200** years and the  
peak population increases by a factor of **~20!**  
**Reminiscent of the Industrial Revolution!**

# Population and GDP per capita: explosion is very recent (1950)



Consumption is growing  
~ 2% population  
~ 2% GDP/cap  
  
~ 4% per year!

**Since 1950,  
we double our total  
consumption  
every 17 years!**

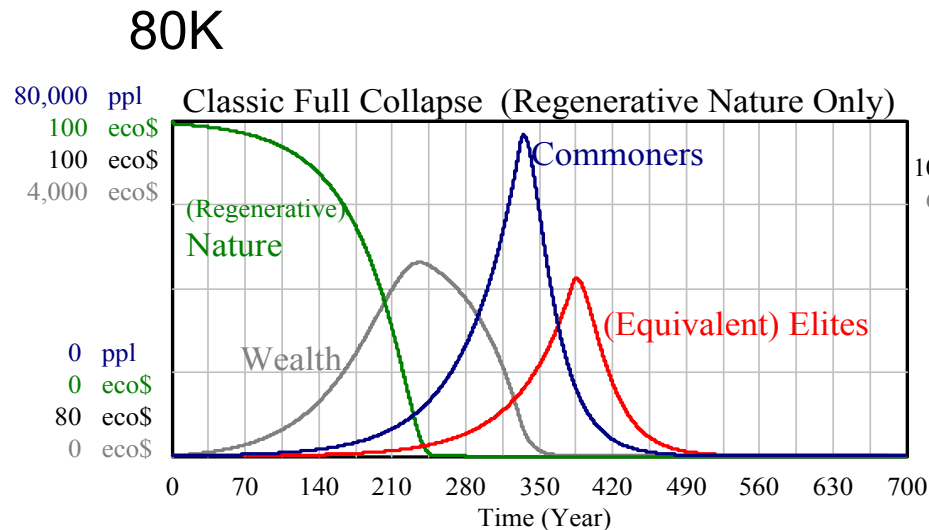


# Non-Renewables **Expanded** the Carrying Capacity:

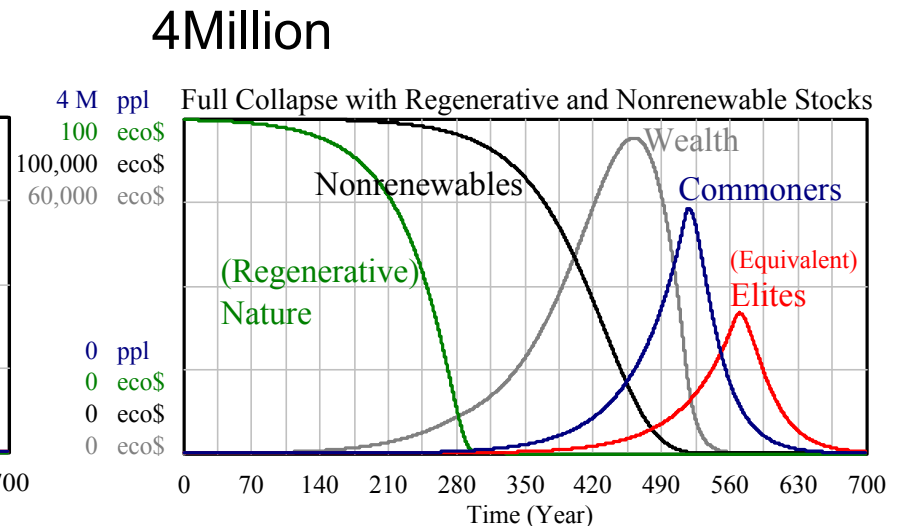
---

- Fossil Fuels are Stocks of Energy and Material Resources **accumulated**
- *over several hundreds of millions years.*
- We are *consuming those stocks in ~ 3 centuries.*
- A **similar dynamic** is taking place with Aquifer Water. In just a few decades, we are drawing down vast stores of fresh water from *aquifers that take centuries or millennia to recharge.*

# Impact of adding fossil fuels (nonrenewable energy resources)



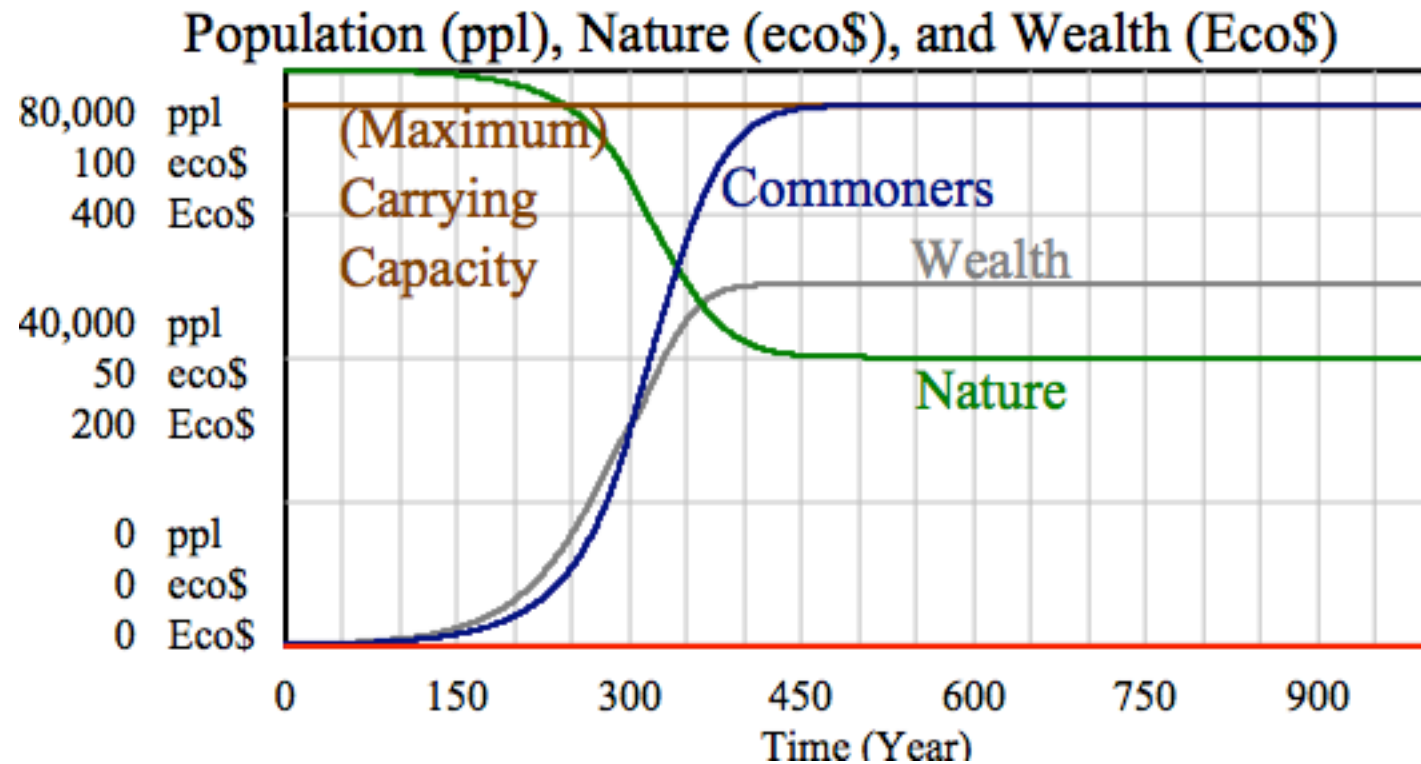
Regenerating Nature Only



Both Regenerating and  
Nonrenewable  
Resources

The collapse is postponed by **~200** years and the  
peak population increases by a factor of **~20!**  
**Reminiscent of the Industrial Revolution!**

Can we survive? **Yes!** (but only if we live sustainably!)



**Carrying capacity:** the population that nature can sustain forever.

If we use nature in a sustainable way, and consume only as much as nature can regrow, we can reach a good state of equilibrium

# Summary

- We are using up in 200+ years the fossil fuels that nature accumulated over millions of years. Same with fossil water.
- The use of fossil fuels for agriculture increased food production and population after 1950.
- HANDY I “thought experiments” show that reducing:
  1. Social inequality
  2. Population growth
  3. Depletion per capita allow society to become sustainable.
- HANDY II: Adding non-renewables
  1. Increases maximum population by ~20 times.
  2. Postpones collapse by about 200-300 years
  3. If the transition from fossil to renewables (solar and winds) is done early enough, it is possible to avoid the collapse.

We are NOT modeling the coupled Earth-Human System!

- We need to couple them to provide feedbacks!
- Data assimilation can help tune the coupled models

# Summary

- We are using up in 200+ years the fossil fuels that nature accumulated over millions of years. Same with fossil water.
- The use of fossil fuels for agriculture increased food production and population after 1950.
- HANDY I “thought experiments” show that reducing:
  1. Social inequality
  2. Population growth
  3. Depletion per capita allow society to become sustainable.
- HANDY II: Adding non-renewables
  1. Increases maximum population by ~20 times.
  2. Postpones collapse by about 200-300 years
  3. If the transition from fossil to renewables (solar and winds) is done early enough, it is possible to avoid the collapse.

We are NOT modeling the coupled Earth-Human System!

- We need to couple them to provide feedbacks!
- Data assimilation can help tune the coupled models

# Summary

- We are using up in 200+ years the fossil fuels that nature accumulated over millions of years. Same with fossil water.
- The use of fossil fuels for agriculture increased food production and population after 1950.
- HANDY I “thought experiments” show that reducing:
  1. Social inequality
  2. Population growth
  3. Depletion per capita allow society to become sustainable.
- HANDY II: Adding non-renewables
  1. Increases maximum population by ~20 times.
  2. Postpones collapse by about 200-300 years
  3. If the transition from fossil to renewables (solar and winds) is done early enough, it is possible to avoid the collapse.

We are NOT modeling the coupled Earth-Human System!

- We need to couple them to provide feedbacks!
- Data assimilation can help tune the coupled models

# Summary

- We are using up in 200+ years the fossil fuels that nature accumulated over millions of years. Same with fossil water.
- The use of fossil fuels for agriculture increased food production and population after 1950.
- HANDY I “thought experiments” show that reducing:
  1. Social inequality
  2. Population growth
  3. Depletion per capita allow society to become sustainable.
- HANDY II: Adding non-renewables
  1. Increases maximum population by ~20 times.
  2. Postpones collapse by about 200-300 years
  3. If the transition from fossil to renewables (solar and winds) is done early enough, it is possible to avoid the collapse.

**We are NOT modeling the coupled Earth-Human System!**

- We need to couple them to provide feedbacks!
- Data assimilation can help tune the coupled models

# Summary

- We are using up in 200+ years the fossil fuels that nature accumulated over millions of years. Same with fossil water.
- The use of fossil fuels for agriculture increased food production and population after 1950.
- HANDY I “thought experiments” show that reducing:
  1. Social inequality
  2. Population growth
  3. Depletion per capita allow society to become sustainable.
- HANDY II: Adding non-renewables
  1. Increases maximum population by ~20 times.
  2. Postpones collapse by about 200-300 years
  3. If the transition from fossil to renewables (solar and winds) is done early enough, it is possible to avoid the collapse.

Thanks!

**We are NOT modeling the coupled Earth-Human System!**

- We need to couple them to provide feedbacks!
- Data assimilation can help tune the coupled models