

# Economics 134 L7. Climate Change I

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# Climate change

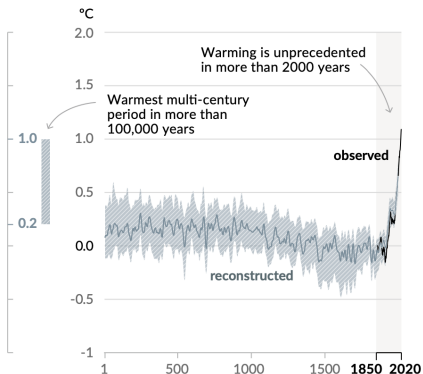
Why study climate change?

- ① One of the greatest challenges of our time
- ② Raises new and interesting economic issues
  - ① balancing energy use with decarbonization (today)
  - ② discounting and long-run environmental policy (L8)
  - ③ risk, uncertainty, and irreversibility (L9)
  - ④ international negotiation and cooperation (L10)

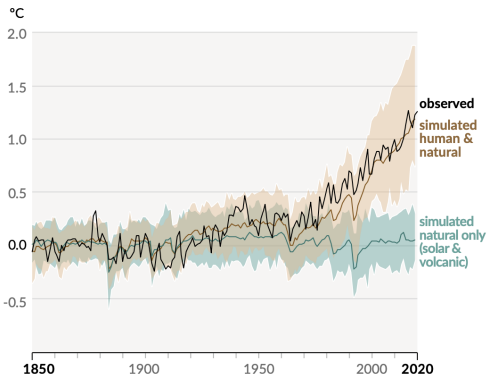
# 1. Unprecedented rise in global temperature due to CO<sub>2</sub>

## Changes in global surface temperature relative to 1850-1900

a) Change in global surface temperature (decadal average) as **reconstructed** (1-2000) and **observed** (1850-2020)



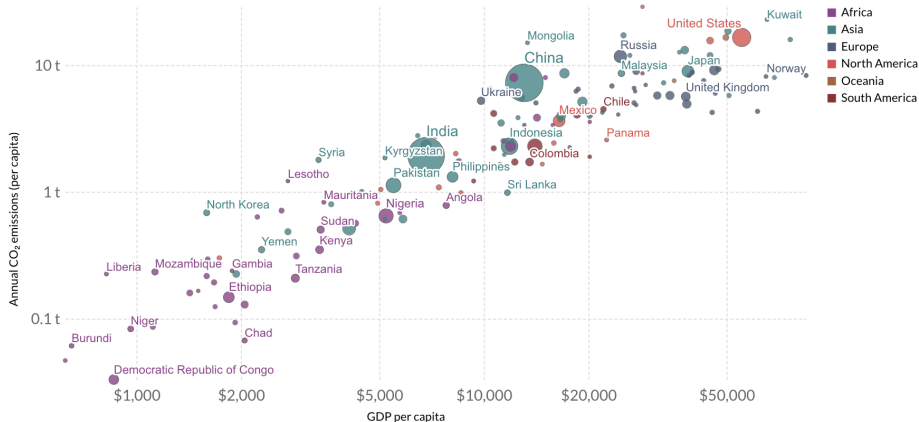
b) Change in global surface temperature (annual average) as **observed** and simulated using **human & natural** and **only natural** factors (both 1850-2020)



Source. IPCC August 2021, p. 8

## 2. Strong correlation between CO<sub>2</sub> and economic output

CO<sub>2</sub> per dollar GDP, across countries



Source: Our World in Data based on the Global Carbon Project, Maddison Project Database 2020 (Bolt and van Zanden (2020))

# Plan for today

Today, we'll introduce two sides of the equation:

- ① Some economic damages from climate change (benefits to ↓ temperatures)
- ② Some economic value of carbon emissions (costs of mitigation)

and we will study the efficient climate change policies that they imply.

For now, we'll **assume** we know how to (a) value events in the future; (b) deal with uncertain and/or irreversible outcomes; (c) coordinate with every country.

→ each of these assumptions is unrealistic and we **will** relax them all, but it is useful to start with the simplest case.

## 1. Estimating climate damages

Empirical strategy

Aggregate damage function

## 2. Estimating costs of reducing climate change

Three strategies

Case studies

Aggregate cost function

## 3. Calculating the optimal global carbon price

Integrated assessment modeling

Social cost of carbon

Policy evaluation

# Estimating climate damages

Estimating the economic damage from climate change involves a few steps:

- ① mapping  $\text{CO}_2 \mapsto$  **climate change**
  - already demonstrated a robust average relationship ✓
  - predicting **when and where** such changes will occur is much more difficult
  - we will leave this (mostly) to the climate scientists!
- ② mapping **climate change** (e.g., temperature)  $\mapsto$  **economic damage**
  - this is economists' comparative advantage

Some challenges are

- tremendous uncertainty about the details of the climate physics
- the **myriad effects** climate has on a vast range of economic activities

## Example: Agricultural yields and temperature

Much of the work underlying the economics of climate change involve looking at **specific industries** and relating changes in **temperature** to outcomes

We'll briefly consider an example, that looks at agricultural yields in the U.S.

- 2.6m workers (1.4% of workforce); \$136bn output (0.6% of GDP) in 2020
- world's largest agricultural producer (41%, 38% of world's corn, soybeans)

Paper:

- Schlenker and Roberts (2009), "Nonlinear temperature effects indicate severe damages to U.S. crop yields under climate change," *Proceedings of the National Academy of Sciences*, **106**(37): 15594–15598.



# Empirical strategy

**Research strategy:** combine detailed spatial data on daily temperature (exposure during growing season) and U.S. crop yields from 1950–2005

In words: compare crops

- grown in the **same** county in **different** years
- controlling for state-specific effects over time

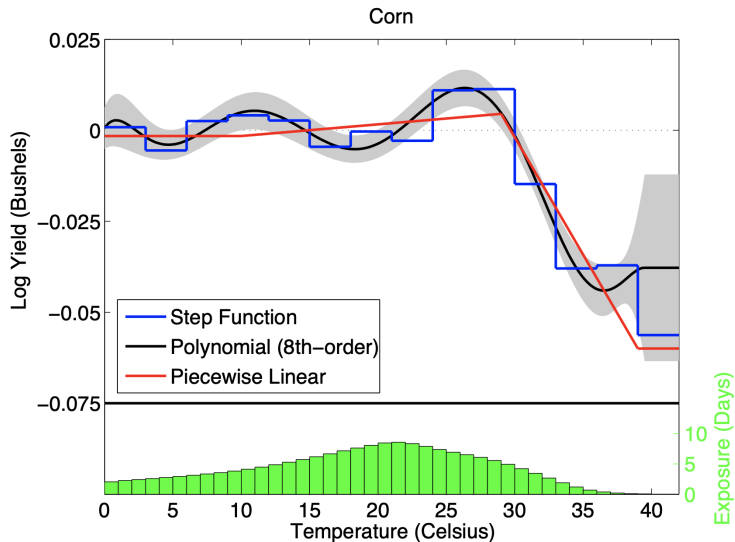
to isolate the effect of hotter days on yields ( $\text{yield} \equiv \text{output/acre}$ ).

In math: estimate a nonlinear function  $g$  to fit the data:

$$\text{yield}_{it} = g(\text{temperature}_{it}, \text{controls}_{it}) + \varepsilon_{it}$$

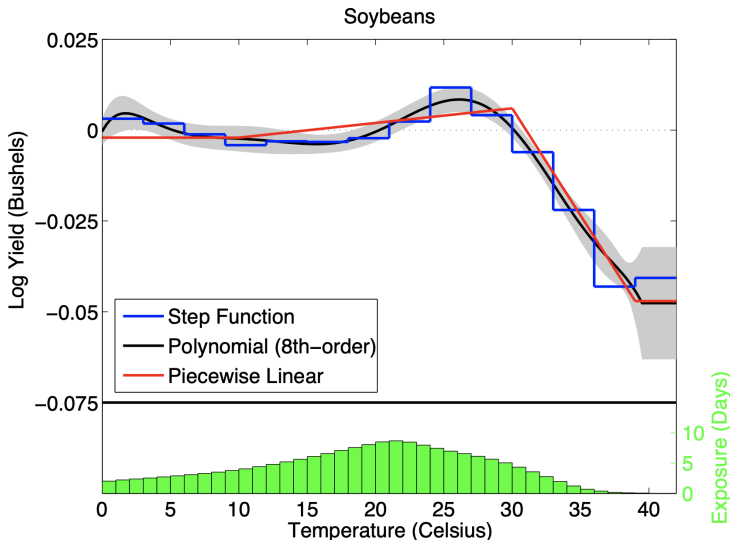
across counties  $i$  and years  $t$ , given measurement error  $\varepsilon_{it}$ .

# Agricultural yields and temperature: Results



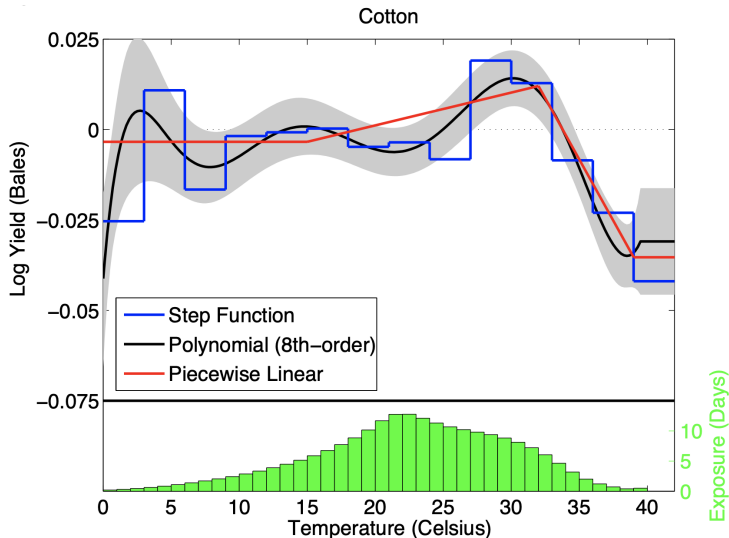
**Source.** Schlenker and Roberts (2009, Figure 1A, p. 15595).

# Agricultural yields and temperature: Results



Source. Schlenker and Roberts (2009, Figure 1B, p. 15595).

# Agricultural yields and temperature: Results



Source. Schlenker and Roberts (2009, Figure 1C, p. 15595).

# Agricultural yields and temperature: Results

Finding:

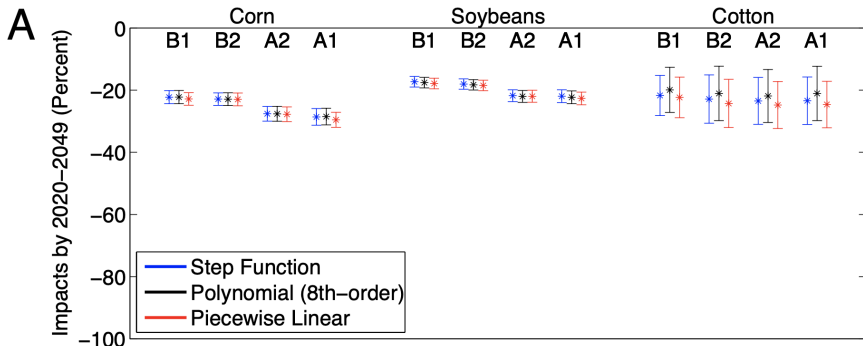
- threshold in output effects starting between 29–32°C, depending on the crop
- temperature moderately beneficial until the threshold
- **very harmful** above the threshold

Why should we care?

- ↪ if the distribution of average temperature shifts to the right, then we will see more **very hot** days

We can study this directly, by projecting the estimates into the future using predicted temperatures under future climate change scenarios ↪

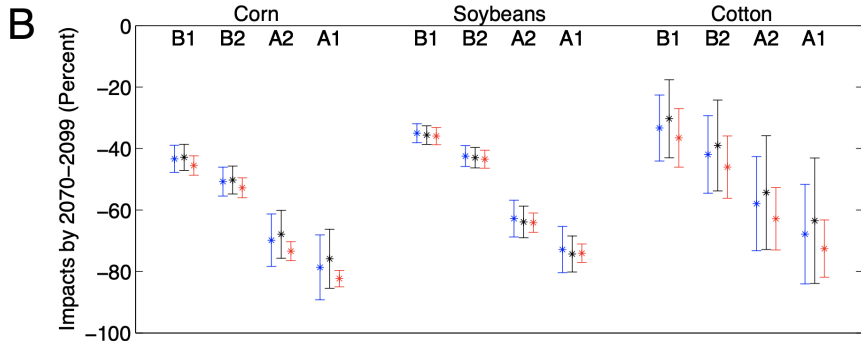
# Implications of global warming



**Fig. 2.** Predicted climate-change impacts on crop yields under the Hadley III climate model. Graphs display predicted percentage changes in crop yields under four emissions scenarios. Frame A displays predicted impacts in the medium term (2020–2049) and frame B shows the long term (2070–2099). A star indicates the point estimates, and whiskers show the 95% confidence interval after adjusting for spatial correlation. The color corresponds to the regression models in Fig. 1.

**Source.** Schlenker and Roberts (2009, p. 15595).

# Implications of global warming, cont'd



**Fig. 2.** Predicted climate-change impacts on crop yields under the Hadley III climate model. **Graphs display predicted percentage changes in crop yields under four emissions scenarios.** Frame A displays predicted impacts in the medium term (2020-2049) and frame B shows the long term (2070-2099). A star indicates the point estimates, and whiskers show the 95% confidence interval after adjusting for spatial correlation. The color corresponds to the regression models in Fig. 1.

**Source.** Schlenker and Roberts (2009, p. 15595).

# Many empirical studies

Many other studies proceed along these lines: (a) try to isolate comparisons that control for omitted variables, and then (b) learn about the effects of temperature on outcomes of economic interest.

For example, economists have found

- hotter days increase mortality ([Barreca et al. 2015](#))
- hotter days reduce worker productivity ([Heal and Park 2016](#))
- hotter days increase workplace injuries ([Park, Pankratz, and Behrer 2021](#))
- higher annual temperatures lower economic growth in developing countries ([Dell, Jones, Olken 2012](#))
- hurricanes and tropical storms reduce long-run economic output ([Hsiang 2010](#))

See [Dell, Jones, Olken 2014](#) ([course website](#)) for one synopsis.



# Caveat

Important distinction to keep in mind: **climate**  $\neq$  **weather**

- **climate**: distribution of weather outcomes
- **weather**: realization of climate (e.g., today's temperature or rainfall)

Commentators (and economists!) frequently confuse the two.

But the distinction is crucial for economic analysis:

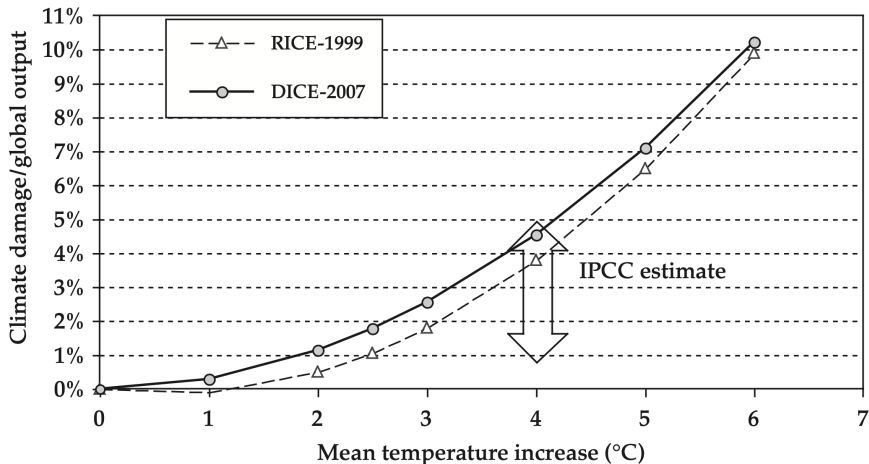
- **climate change** is somewhat permanent and should affect longer-run economic decisions (where to live, where to work, what technology to invent)
- changes in the **weather** may be transient and entail very different economic responses

# Discussion

General idea of constructing a damage function:

- obtain a **lot** of these small estimates
- add them up to obtain total damage for each sector and each county for a given increase in temperature
- use to trace out the **aggregate** climate damages curve as a function of the temperature increase

# Aggregate climate damage function



1. Estimating climate damages
  - Empirical strategy
  - Aggregate damage function
2. Estimating costs of reducing climate change
  - Three strategies
  - Case studies
  - Aggregate cost function
3. Calculating the optimal global carbon price
  - Integrated assessment modeling
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  - Policy evaluation

# Three ways to prevent climate change

Broadly, three strategies for slowing climate change:

- ① **Reduce emissions** from economic production
- ② Directly remove carbon from emissions or the atmosphere (**carbon removal**)
- ③ Engineer the climate directly (**geoengineering**) or engage in other adaptation strategies.

With the possible exception of (3), each of these strategies will play a role in our response to climate change.

We'll discuss them in reverse order.

### 3. Geoengineering

Conceptually straightforward (cloud seeding since the 1970s; well-established link between volcanic eruptions and temperature reductions); **very** inexpensive.

Details are much murkier.

Possibly very bad side effects.

#### **Bottom line:**

- **geoengineering** may or may not be allowed
  - even proponents agree that it is dangerous to rely exclusively on untested technology to radically alter the environment
  - some concerns that the prospect of geoengineering itself may delay the transition to clean technology (e.g., [Acemoglu and Rafey 2023](#))
- **adaptation** should and will be undertaken, but it's not free

## 2. Carbon removal

Highly attractive in principle: reverse combustion!

Difficult in practice: **very costly** per ton of carbon, both in terms of money and also energy

- lots of engineers trying to solve this problem, but limited progress

Trees offer a natural solution, though require continuous monitoring + management.

↪ we'll discuss this more later in the course!

# 1. Reduce emissions

Lowering emissions (abatement):

- policymakers' **main focus** since the first UN assessment (IPCC, 1990)
- “the only realistic option to deal with climate change” (Nordhaus 2018, p. 447)

Broadly, two complementary strategies:

- **substitute** away from fossil-fuel intensive production towards different activities that do not use fossil fuels
  - e.g., switch from coal to natural gas, nuclear, or renewables for electricity generation (or stop consuming energy entirely)
- **better technology** to improve the efficiency of carbon-based production
  - e.g., more efficient internal combustion engines; electric cars



# 1. Reduce emissions, cont'd

From an economic perspective, **both should entail costs**.

↪ If individuals (*firms*) are maximizing utility (*profits*), economic theory indicates that distorting their decisions will entail some costs for these individuals (*firms*).

Of course, this does not suggest that such costs will exceed the benefits.

# 1. Reduce emissions, cont'd

Substitution and more efficient technology each can be important.

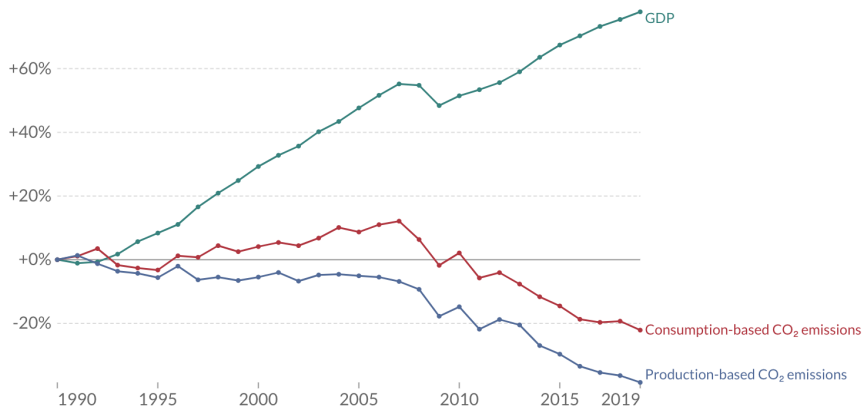
In the U.K.,

- largely phased out coal
- substantially increased share of renewables for electricity
- outsourced emissions to other countries with trade

# UK emissions, 1990–2020

## Change in CO<sub>2</sub> emissions and GDP, United Kingdom

Consumption-based emissions are domestic emissions which have been adjusted for trade. It's production-based emissions minus emissions embedded in exports, plus emissions embedded in imports.



Source: Global Carbon Project; World Bank

Note: Gross Domestic Product (GDP) figures are adjusted for inflation.

[OurWorldInData.org/co2-and-other-greenhouse-gas-emissions](https://OurWorldInData.org/co2-and-other-greenhouse-gas-emissions) •

# 1. Reduce emissions, cont'd

Substitution and more efficient technology each can be important.

In the U.K.,

- largely phased out coal
- substantially increased share of renewables for electricity
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In China,

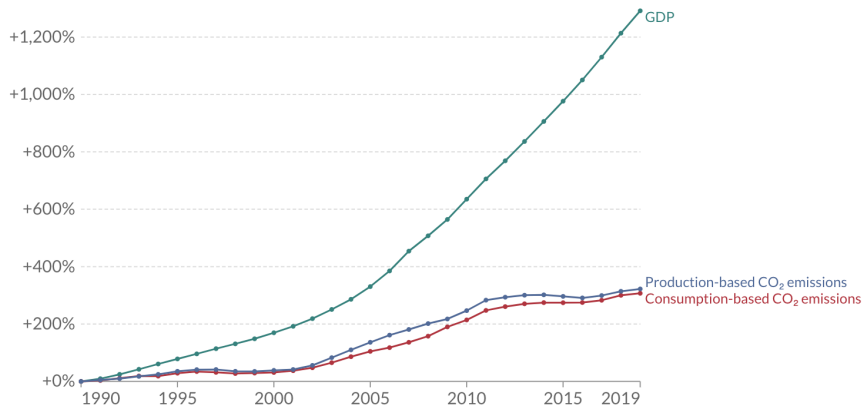
- still a very coal-intensive, rapidly growing industrial economy
- significant decline in “emissions intensity” largely due to replacing older coal plants with newer, much more efficient coal power plants

Of course, always do both: China has invested substantially in renewables; the UK has also invested in more efficient technology.

# China's emissions, 1990–2020

## Change in CO<sub>2</sub> emissions and GDP, China

Consumption-based emissions are domestic emissions which have been adjusted for trade. It's production-based emissions minus emissions embedded in exports, plus emissions embedded in imports.



Source: Global Carbon Project; World Bank

Note: Gross Domestic Product (GDP) figures are adjusted for inflation.

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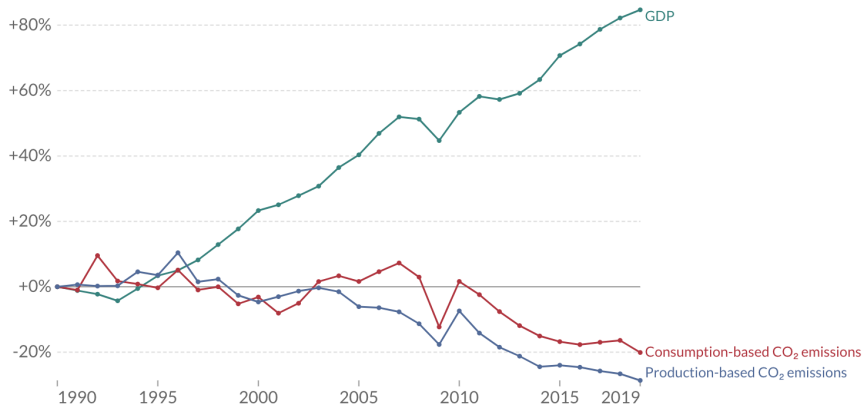
# A last example: Sweden

Often hailed as a success story. ↷

# A last example: Sweden

## Change in CO<sub>2</sub> emissions and GDP, Sweden

Consumption-based emissions are domestic emissions which have been adjusted for trade. It's production-based emissions minus emissions embedded in exports, plus emissions embedded in imports.

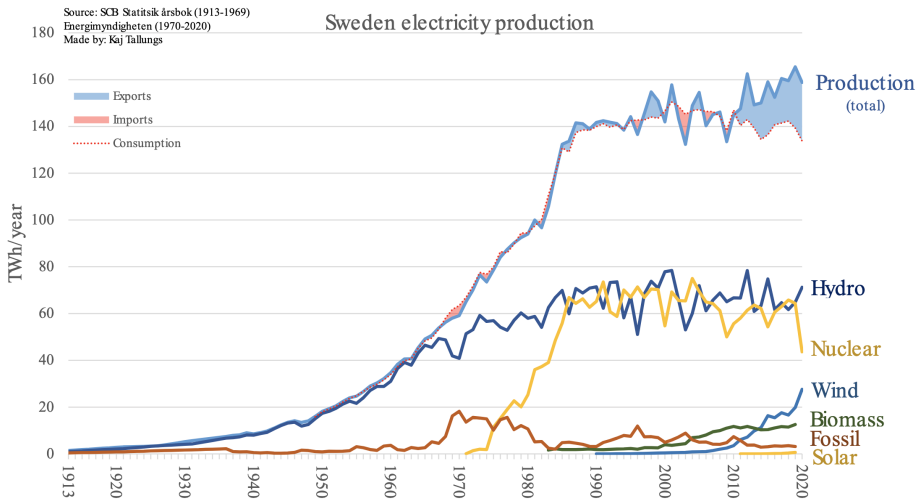


Source: Global Carbon Project; World Bank

Note: Gross Domestic Product (GDP) figures are adjusted for inflation.

OurWorldInData.org/co2-and-other-greenhouse-gas-emissions •

# Sweden endowed with renewable energy since 1970s





# Sweden's carbon emissions and carbon tax

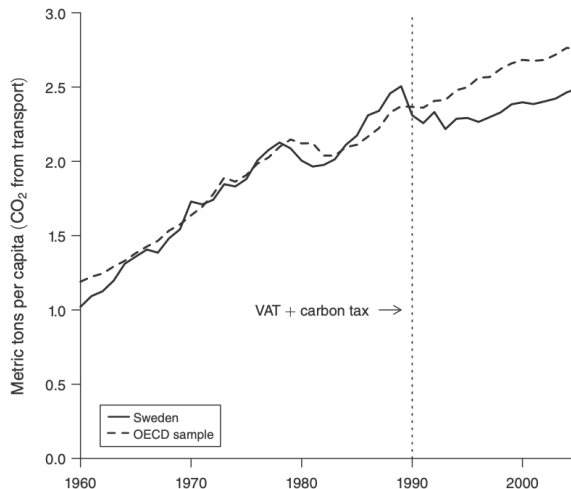


FIGURE 3. PATH PLOT OF PER CAPITA CO<sub>2</sub> EMISSIONS FROM TRANSPORT DURING 1960–2005:  
SWEDEN VERSUS THE OECD AVERAGE OF MY 14 DONOR COUNTRIES

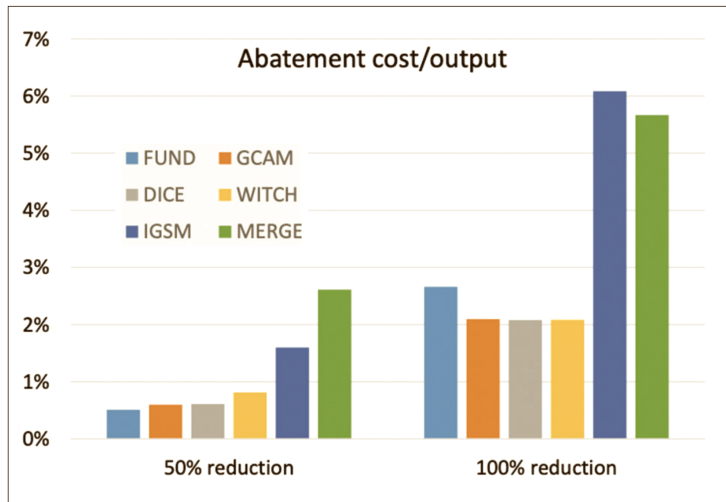
**Source.** Andersson (2019, AEJ: Economic Policy 11(4): 1–30).

# Discussion

Similar to economic damages from climate change, the idea is to

- add up the costs of switching to lower-carbon activities
- account for innovation and technical change over time
- for each level of global emissions, calculate the total abatement costs (relative to not doing anything or “business-as-usual”)
- use these estimates to construct costs for different levels of climate policy

# Abatement costs across various models



Source. Nordhaus (2018, p. 447).

# Not on an exam

If you're curious, the models in the previous figure are:

- **FUND** (Climate Framework for Uncertainty, Negotiation and Distribution) at the University of Sussex
- **DICE** (Dynamic Integrated Climate Change) at Yale
- **IGSM** (Integrated Global System Modeling) at MIT
- **GCAM** (Global Change Analysis Model) at the University of Maryland
- **WITCH** (World Induced Technical Change Hybrid) at the European Institute on Economics and the Environment, Milan
- **MERGE** (Model for Estimating the Regional and Global Effects of Greenhouse Gas Reductions) at the Electric Power Research Institute, Washington DC
- **PISCES** (Psychological Intelligence Schemes for Expediting Surrender) at The White Visitation

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# Integrated assessment modeling

Recall our solution to externalities:

$$\pi'(q^{\text{FB}}) - D'(q^{\text{FB}}) = 0. \quad (\star)$$

In this case,

- marginal profits depended on output (higher  $q$ , lower marginal profits)
- marginal damage depended on output (higher  $q$ , higher marginal damages)

Now, suppose  $q$  is carbon emissions:

- marginal abatement cost ( $-\pi'$ ) depends on speed of emission reductions
- marginal benefit of reducing emissions ( $D'$ ) depends on total carbon stock

Nordhaus' Nobel Prize contribution: an “integrated assessment model” that tries to find  $q^{\text{FB}}$  by solving a dynamic version of  $(\star)$  that incorporates climate physics.

# Key contributions

Nordhaus' research has led directly to two important outcomes:

- 1 the **social cost of carbon** (i.e.,  $D'$ ), which, from our previous lectures, we know relates to the optimal carbon tax
- 2 a systematic way to evaluate different climate policies (emissions trajectories) with **cost-benefit analysis**

# Social cost of carbon

The social cost of carbon is calculated as  $D'(q)$ , the marginal damage of an additional ton of carbon dioxide:

	Social Cost of Carbon			
	[2018 \$ per ton of CO2]			
Year	2015	2020	2050	2100
Base	37	45	108	304
Optimal	36	43	105	295
Optimal (alt dam)	91	108	249	584

Source. Nordhaus (2018, Table 1, p. 454).

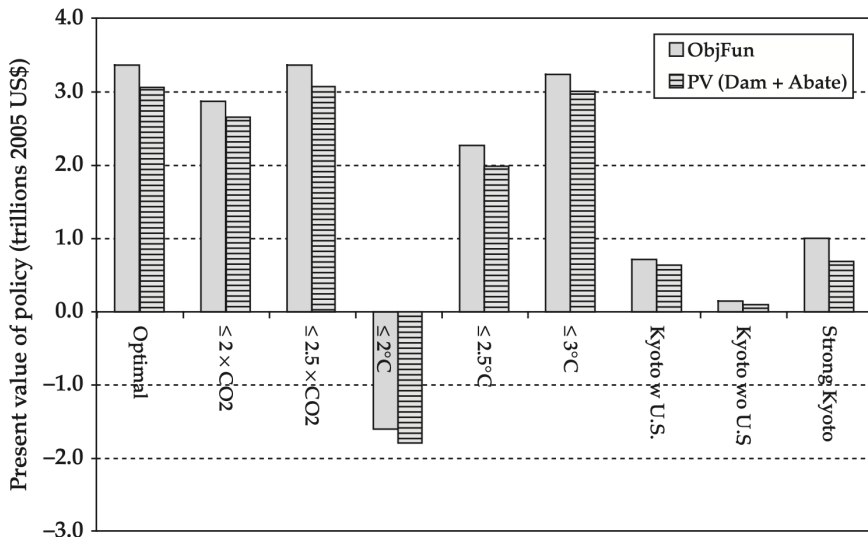


# Discussion

Key insights:

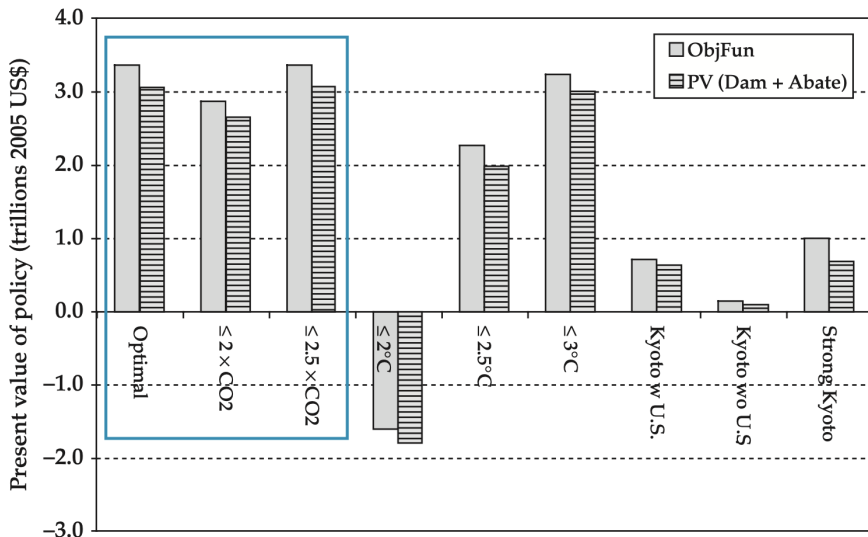
- **huge** net benefits for climate policy relative to inaction
- start emissions reductions **as soon as possible**
- ramp up **over time**, to give firms time to adapt
- more stringent targets entail **much higher costs**...

# Net benefits of different policies



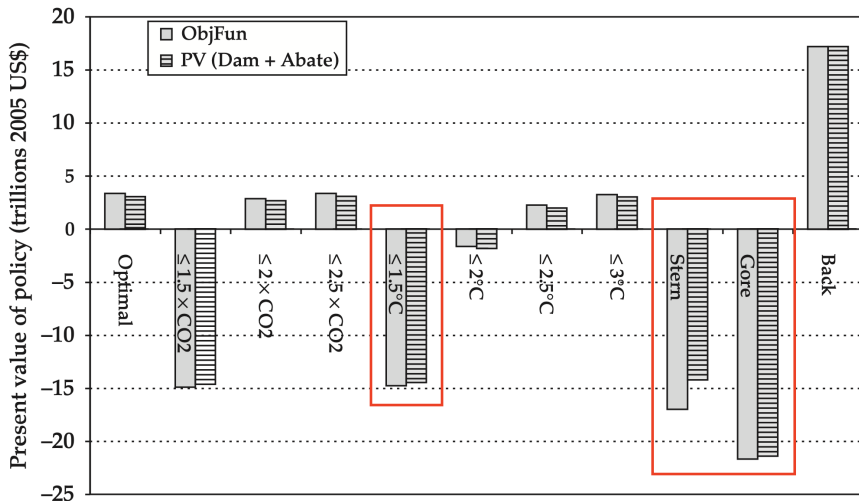
Source. Nordhaus (2008, Figure 5-2, p. 86).

# Net benefits: Optimal targets



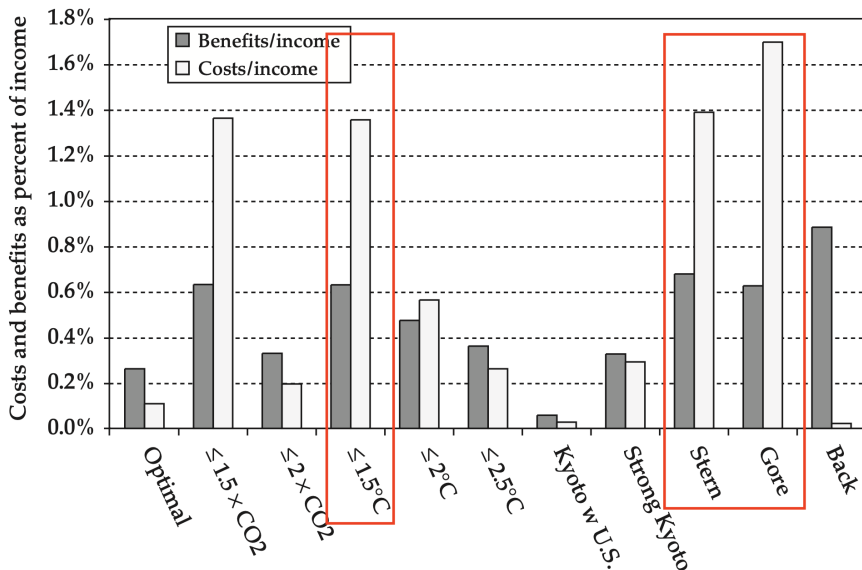
Source. Nordhaus (2008, Figure 5-2, p. 86).

# Net benefits: Stricter climate targets

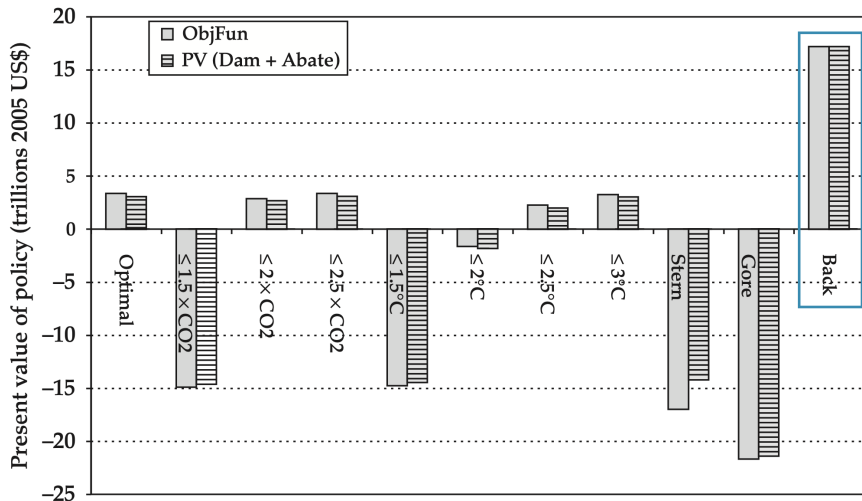


Source. Nordhaus (2008, Figure 5-1, p. 85).

# Benefits v. costs: Stricter climate targets

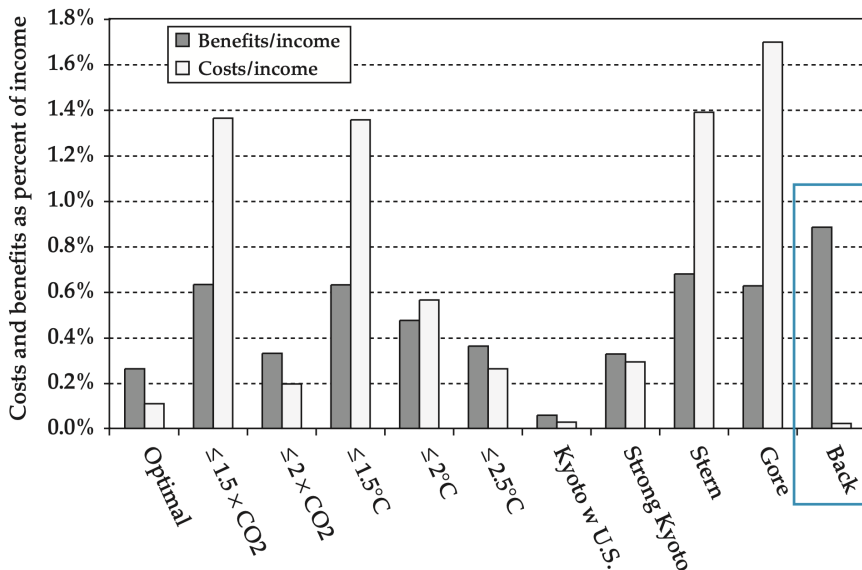


# Technological breakthrough



Source. Nordhaus (2008, Figure 5-3, p. 90).

# Technological breakthrough



# Technological breakthrough

*“We estimate that such a low-cost zero-carbon technology would have a net value of around **\$17 trillion in present value** because it would allow the globe to avoid most of the damages from climate change” (Nordhaus 2008, p. 19)*



# Next Monday

Consider reading:

- Nordhaus (2018), “Climate change: The ultimate challenge for economists,” Nobel Prize Lecture, December 8, 2018 ([on the website](#))

No other homework.