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A simple formula for the social costs of carbon

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This research

- “Een eenvoudige formule voor de maatschappelijke kosten van CO₂”
 - ◆ rapport voor Ministerie van Infrastructuur en Milieu
- “A simple formula for the social cost of carbon”
 - ◆ Under review

Literature: IAM

- Social Cost of Carbon (SCC) = monetized damage from emitting one unit of CO₂ to the atmosphere
- Obtained from computational Integrated Assessment Models (IAMs), e.g. Global2100, DICE, MERGE, CETA, FUND, PAGE, MIND, DEMETER, ... AR5-WG3-CH6
- Systematic assessments: Weyant, de la Chesnaye & Blanford, 2006; Hope, 2008; Nordhaus, 2008; Anthoff & Tol, 2013
 - ◆ Higher climate sensitivity, higher estimates of damages for given temperature change, and lower discount rates generally lead to higher SCC
- Fundamental problem: IAMs remain a black box / accepted or rejected on the basis of trust (Kelly & Kolstad, 1999a)

Literature: SCC formulas

- Analytical formula for SCC
- Golosov et al. (2014) derive an analytical formula for the SCC
 - ◆ based logarithmic utility, climate-change damages proportional to output and exponential in the atmospheric CO₂.
 - ◆ Barrage et al. (2014) sensitivity analysis of the assumptions
- Gerlagh and Liski (2012) add better climate system + time-inconsistent preferences.

This paper

- Present a ‘simple formula’ for the social costs of carbon
 - ◆ Based on balanced growth approximation
- More complicated vis-à-vis Golosov et al. (2014) & Gerlagh and Liski (2012)
 - ◆ Added: non-logarithmic utility, population growth, flexible damages
- Test formula

Purpose

- ‘simple’ derivation: education of SCC user
- simple rule: easy to test normative/descriptive choices

Educational purpose

Based on

- Fundamentals of climate change dynamics
- Fundamentals of economic analysis

Advantages:

- Provides precise insights in the relevant assumptions
 - ◆ positive (carbon cycle, temperature sensitivity, damages, discount rate)
 - ◆ normative (damages, discount rate)
- Explains the uncertainty in SCC estimates to the laymen
- Shows mechanisms for SCC growth over time

Tested

- The formula explains 99% of within-model SCC variation (DICE - Monte Carlo)

Testing the formula

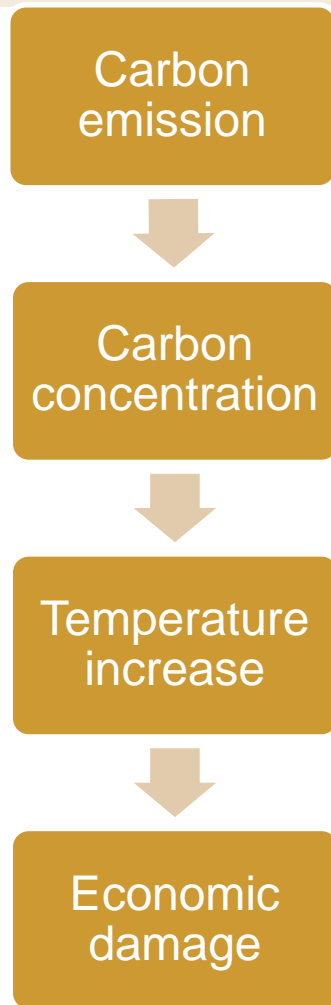
How much of the SCC variation is captured by the formula?

- The formula explains 99% of within-model SCC variation (DICE - Monte Carlo)

Where does the formula perform badly?

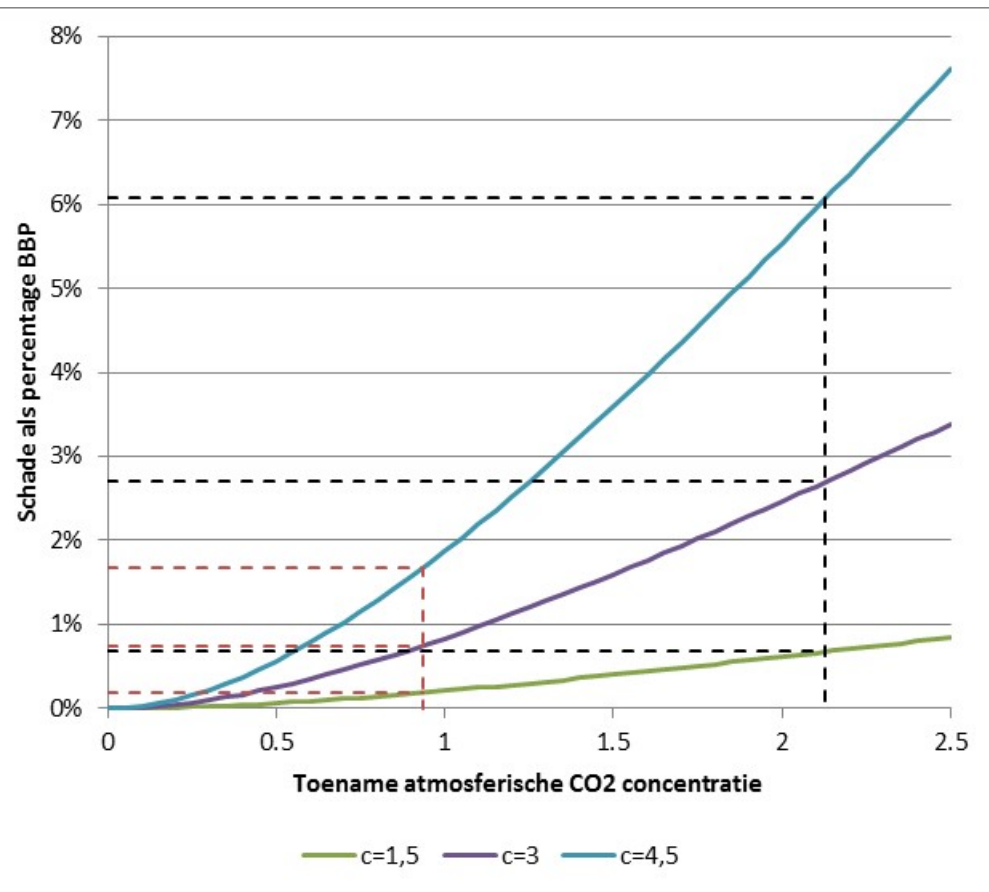
- Interaction between convexity of damages and discount rate is absent from formula

Deriving the formula: available on request in 30mins



1. Calculate damage per CO₂ when considering atmospheric CO₂ without decay
2. Add CO₂ decay
3. Add temperature lag
4. Determine effective discount rate

Step 1a: what if climate change was immediate?



- Assume 3 Kelvin climate sensitivity

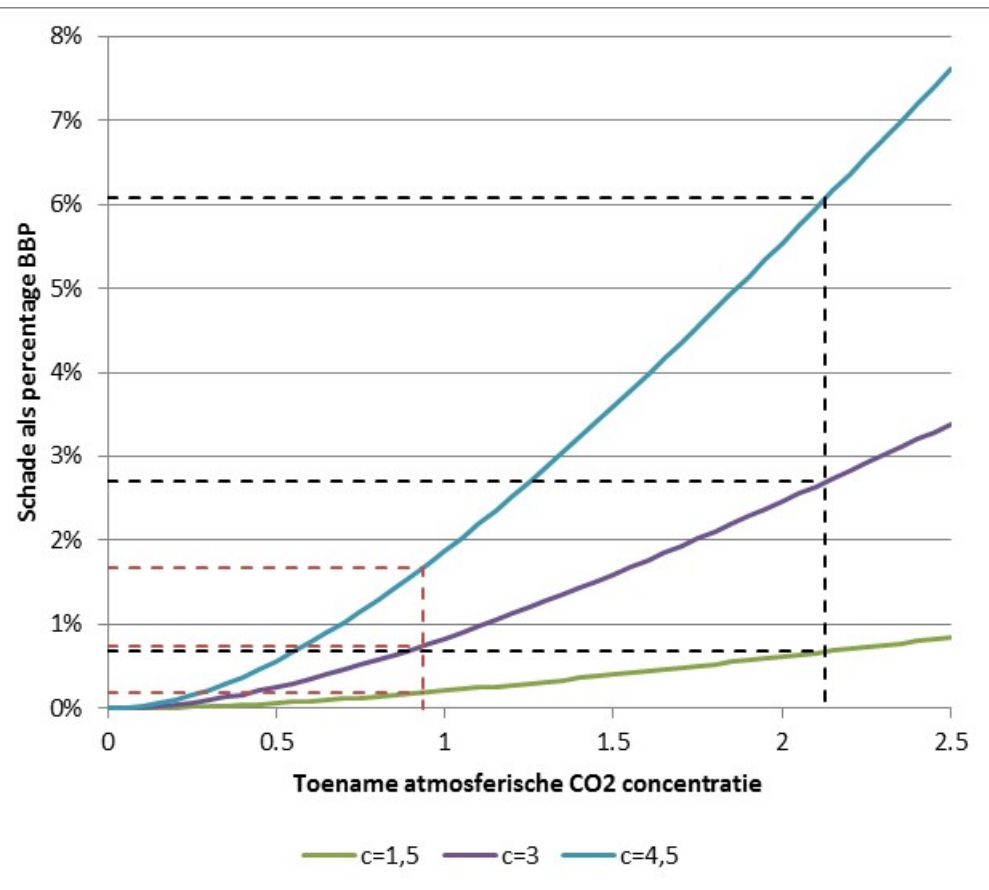
$$IMD = \frac{1.3\omega}{m} Y$$

The *Immediate Marginal Damage* depends on

- ω : Damage parameter [%GDP] at 3K
- m : natural atmospheric CO₂ [TtCO₂]
- Y : Income [T€/yr]

$$IMD = \frac{1.3 \cdot 0.027}{2.1} 60 = 1 \text{ €/tCO}_2$$

Step 1b: what if climate change was immediate?



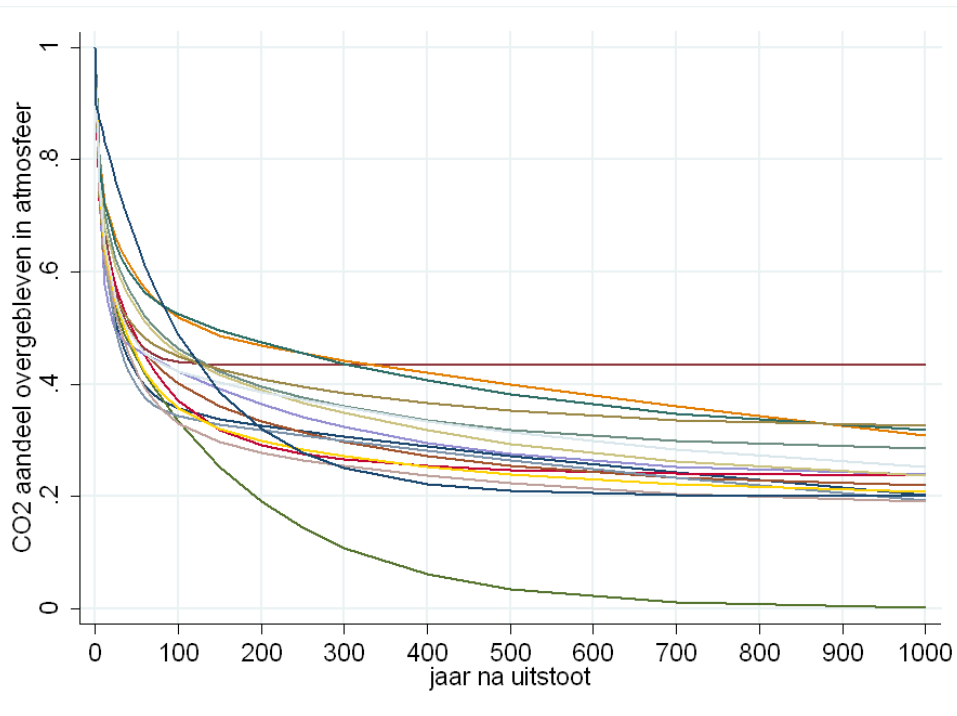
$$IMD = \frac{1.3\omega(c/3)^\psi}{m} Y$$

The *Immediate Marginal Damage* depends on

- ω : Damage parameter [%GDP] at 3K
- c : Temperature sensitivity [K] at doubling CO₂
- ψ : convexity of damages [.]
- m : natural atmospheric CO₂ [TtCO₂]
- Y : Income [T€/yr]

Step 2: Persistence

$$PF = \frac{1}{\delta_S + \sigma}$$



The *Persistence Factor* depends on

- δ_S : Carbon cycle deprecation [%/yr]
- σ : Effective discount rate [%/yr]

$$PF = \frac{1}{0.01/yr + 0.02/yr} = 33 \text{ yr}$$

Step 2: Delay

$$DF = \frac{\varepsilon}{\varepsilon + \sigma}$$

The *Persistence Factor* depends on

- σ : Effective discount rate [%/yr]
- ε : Temperature adjustment speed [%/yr]

$$DF = \frac{0.02/\text{yr}}{0.02/\text{yr} + 0.02/\text{yr}} = 0.5$$

A simple formula for the social costs of carbon

$$SCC = \frac{1.3\omega(c/3)^\psi}{m} \frac{1}{\delta_S + \sigma} \frac{\varepsilon}{\varepsilon + \sigma} Y$$

The SCC depends on

- ω : Damage parameter [%GDP] at 3K
- c : Temperature sensitivity [K] at doubling CO₂
- ψ : convexity of damages [.]
- δ_S : Carbon cycle deprecation [%/yr]
- σ : Effective discount rate [%/yr]
- ε : Temperature adjustment speed [%/yr]
- Y : Income [€/yr]

Everyone can calculate the SCC!

$$SCC = \frac{1.3\omega(c/3)^\psi}{m} \frac{1}{\delta_S + \sigma} \frac{\varepsilon}{\varepsilon + \sigma} Y$$

- Temperature sensitivity: 3K at 2.1 TtCO₂
- Damage parameter: 2.7% at 3K
- Damages quadratic: $\psi = 2$
- CO2 depreciation: 0.01 [./yr]
- Temperature adjustment speed 0.02 [./yr]
- Income: 60 [T€/yr]
- Effective discount rate: 0.02 [./yr]

- SCC: $[1.3/2.1] [0.027] [3/3]^2 [1/0.03] [1/0.04] [60] = 17 [\text{€/tCO}_2]$

You think the discount rate should be 1%?

$$SCC = \frac{1.3\omega(c/3)^\psi}{m} \frac{1}{\delta_S + \sigma} \frac{\varepsilon}{\varepsilon + \sigma} Y$$

- Damage parameter: 2.7% at 3K
- Temperature sensitivity: 3K at 2.1 TtCO₂
- Damages quadratic: $\psi = 2$
- CO2 deprecation: 0.01 [./yr]
- Effective discount rate: 0.01 [./yr]
- Temperature adjustment speed 0.02 [./yr]
- Income: 60 [T€/yr]

- SCC: [1.3/2.1] [0.027] [3/3]² [1/0.02] [1/0.03] [60] = 33 [€/tCO₂]

Feeling lucky: you think the climate is stable?

$$SCC = \frac{1.3\omega(c/3)^\psi}{m} \frac{1}{\delta_S + \sigma} \frac{\epsilon}{\epsilon + \sigma} Y$$

- Damage parameter: 2.7% at 3K
- Temperature sensitivity: 1K at 2.1 TtCO₂
- Damages quadratic: $\psi = 2$
- CO2 deprecation: 0.01 [./yr]
- Effective discount rate: 0.02 [./yr]
- Temperature adjustment speed 0.02 [./yr]
- Income: 60 [T€/yr]
- SCC: $[1.3/2.1] [0.027] [1/3]^2 [1/0.03] [1/0.04] [60] = 1.9 [\text{€/tCO}_2]$

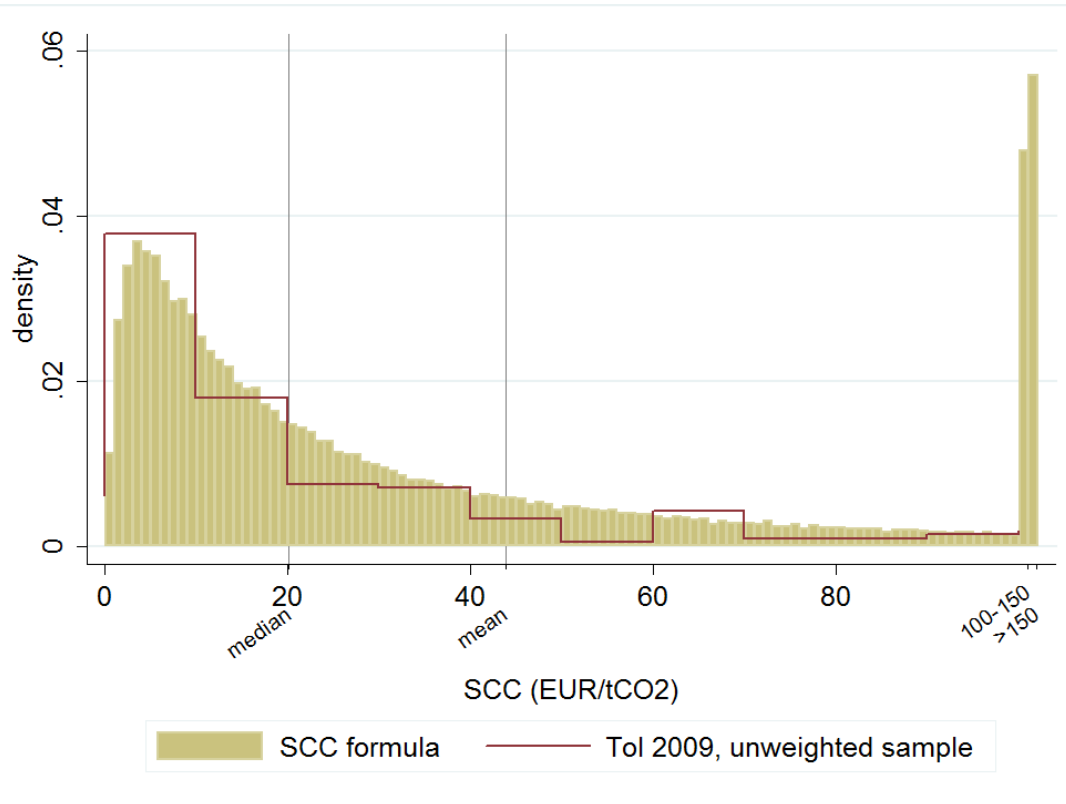
Pessimistic & responsible?

$$SCC = \frac{1.3\omega(c/3)^\psi}{m} \frac{1}{\delta_S + \sigma} \frac{\varepsilon}{\varepsilon + \sigma} Y$$

- Damage parameter: 2.7% at 3K
- Temperature sensitivity: 5K at 2.1 TtCO₂
- Damages quadratic: $\psi = 3$
- CO2 deprecation: 0.01 [./yr]
- Effective discount rate: 0.01 [./yr]
- Temperature adjustment speed 0.02 [./yr]
- Income: 60 [T€/yr]

- SCC: [1.3/2.1] [0.027] [5/3]³ [1/0.02] [1/0.03] [60] = 155 [€/tCO₂]

You don't know?



- Taking the full range for all parameters gives:
- Nice fit of Tol (2009), and
- Median: 20 [€/tCO₂]
- Mean: 48 [€/tCO₂]
- No disagreement, but fundamental uncertainty: Very clear reason why the community can't agree on a unique SCC.

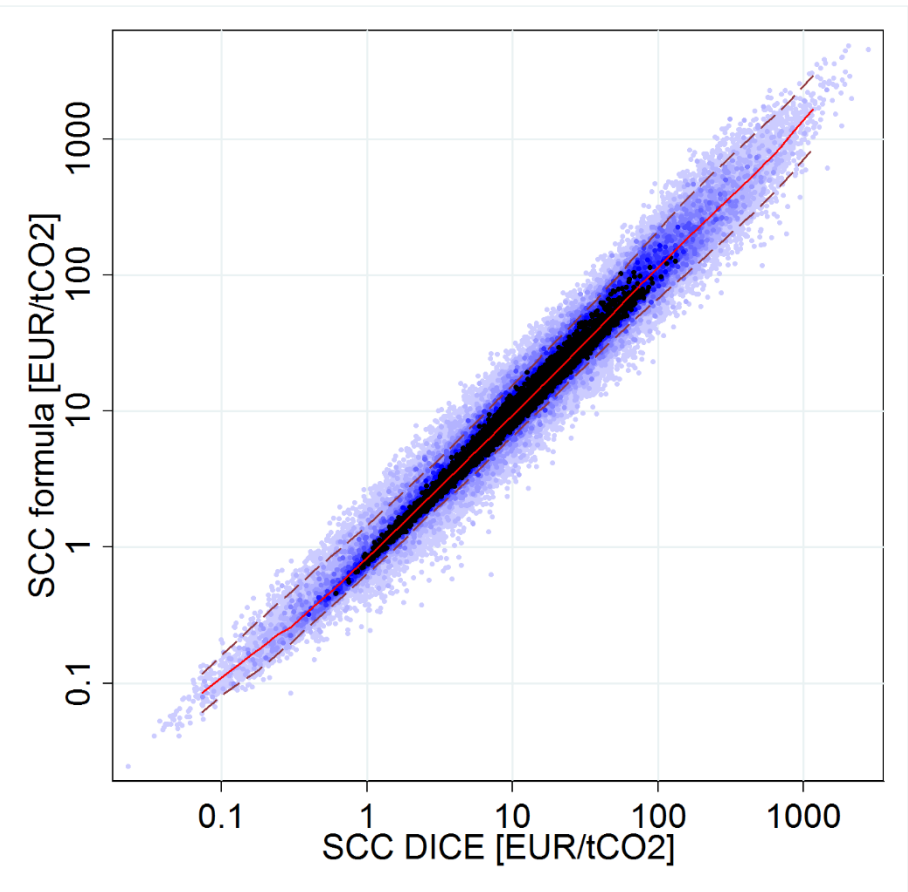
Discounting: extending the Ramsey rule

$$r = \rho + \eta g$$
$$\sigma = r - \xi g - l = \rho + (\eta - \xi)g - l.$$

- σ : climate effective discount rate
- r : real rate of return on investments
- ρ : pure rate of time preferences [0-0.03 /yr]
- η : elasticity of marginal utility [0.5-3]
- ξ : elasticity of damages to income [0-2]
- g : economic per capita growth: [0.015-0.03 /yr]
- l : population growth rate [0.008-0.015 /yr]

- $\sigma = [0.02] + [2-1] [0.02] - [0.01] = 0.03$ /yr

Testing the formula



- Take DICE++: ran 100000 Monte-Carlo simulations
- Vary 14 parameters over WIDE range
 - ◆ Including climate sensitivity, damage parameter, growth, EMU, price of backstops
- Calculate (implicit) formula parameters
- Calculate formula SCC and compare with DICE SCC
- $R^2 \sim 0.99$

Testing the formula

Table 1: Relative gap between formula and DICE SCC values: dependence on main parameters.

	OLS gap	OLS gap	OLS gap	OLS gap	within-sample spread	corner-center effect
	(1)	(2)	(3)	(4)	(5)	(6)
$\ln(c)$	0.255	0.255	0.255	0.225	1.563	0.199
$\ln(\omega)$	0.043	0.044	0.044	0.045	3.219	0.072
ψ	-0.037	-0.037	-0.037	-0.038	2.900	0.055
ξ	0.202	0.202	0.202	0.226	1.263	0.143
ρ	1.733	1.692	1.693	1.093	0.075	0.041
η	-0.100	-0.100	-0.100	-0.103	2.478	0.127
g	-3.793	-3.825	-3.849	-3.313	0.109	0.032
l	10.13	9.894	9.886	10.39	0.005	0.029
$\psi \times \rho$		9.279	9.278	9.803	0.142	0.694
$\psi \times \eta$		0.192	0.192	0.194	4.582	0.446
Other linear var's	NO	NO	YES	YES		
Other interactions	NO	NO	NO	YES		
Nr independent vars	8	10	16	105		
Nr obs	100.000	100.000	100.000	100.000		
R2	0.316	0.640	0.642	0.815		

- Main error of formula: omission of convexity-discount rate interaction

Summary

- SCC can be understood through a simple formula
 - ◆ Useful to laymen, policy makers, researchers
- Skewed distribution:
 - ◆ Most chance of low SCC
 - ◆ But some chance of 'high' SCC
- Uncertainty of 'true' SCC value is clear from uncertainty of fundamental parameters (climate sensitivity)
- and subjective parameters (damage sensitivity, discount rate)

Introduction / model / results / discussion

The Excel file

Excel interface showing the SCC tool v2.xlsx - Excel spreadsheet. The spreadsheet is divided into three main sections: Parameters, Implied values, and Model number/choice.

Parameters	Value (choice)	More or less optimistic than median?	Value within bounds of distribution?	SCC
Climate sensitivity (Celsius at 550ppmv)	3.00	equal	Yes	16.49
Damage at 3 degr Celsius, as share of GWP	2.7%	equal	Yes	
Annual pure rate of time preference	2.0%			
Elasticity of marginal utility	1.5			
Annual productivity growth rate	2.0%			
Annual population growth rate	1.1%			
Parameters	Implied values	More or less optimistic than median?	Value within bounds of distribution?	
Damage parameter	0.003	equal	Yes	
Annual climate discount rate	1.9%	more optimistic	Yes	
Model number	Model choice			
Carbon cycle model	7 CLIMBER2-LPJ			
Temperature adjustment model	9 GFDL-ESM2M			

A blue box labeled "Choose values/models" with an arrow pointing to the input cells in the spreadsheet.

- Put in the numbers
- Select the carbon- and temperature climate model
- SCC comes out.

Next steps (searching for funding from policy)

Extension to CH₄, major GHG gas for agricultural sector

- ‘short-lived’, thus needs thorough analysis of continuous versus discrete time
- Needs new IAM (most IAMs focus on CO₂)

“Common but differentiated responsibilities”

- Formula provides argument why high-income countries ‘should’ implement higher carbon prices

Kuznets curve

- Formula suggests higher carbon prices for higher income