

# Revisiting the social cost of carbon

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**The social cost of carbon (SCC) is a central concept for understanding and implementing climate change policies. This term represents the economic cost caused by an additional ton of carbon dioxide emissions or its equivalent. The present study presents updated estimates based on a revised DICE model (Dynamic Integrated model of Climate and the Economy). The study estimates that the SCC is \$31 per ton of CO<sub>2</sub> in 2010 US\$ for the current period (2015). For the central case, the real SCC grows at 3% per year over the period to 2050. The paper also compares the estimates with those from other sources.**

social cost carbon | climate change | economics | DICE model

The most important single economic concept in the economics of climate change is the social cost of carbon (SCC). This term designates the economic cost caused by an additional ton of carbon dioxide emissions or its equivalent. In a more precise definition, it is the change in the discounted value of economic welfare from an additional unit of CO<sub>2</sub>-equivalent emissions.

The SCC has become a central tool used in climate change policy, particularly in the determination of regulatory policies that involve greenhouse gas emissions (1, 2). Estimates of the SCC are necessarily complex because they involve the full range of impacts from emissions, through the carbon cycle and climate change, and including economic damages from climate change. At present, there are few established integrated assessment models (IAMs) that are available for estimation of the entire path of cause and effect and can therefore calculate an internally consistent SCC. The DICE model (Dynamic Integrated model of Climate and the Economy) is one of the major IAMs used by scholars and governments for estimating the SCC. Up to now, the most recent full-model estimates have been with the DICE-2013R model (2).

The present study presents the results of a fully revised version of the DICE model (as of 2016). This is the first major revision since the Fifth Assessment Report of the Intergovernmental Panel on Climate Change (IPCC). This article describes the changes in the model from the last round, presents updated estimates of the SCC, partitions the changes in the SCC from 2013 to 2016 into the different parts of the model that have changed, and compares the new estimates with other models. The major result is a substantial increase in the estimated SCC.

## Structure of the DICE-2016R Model

**Background on the DICE Model.** The analysis begins with a discussion of the DICE-2016R model, which is a revised version of the DICE-2013R model (1, 3). It is the latest version of a series of models of the economics of global warming developed in collaboration with colleagues at Yale University. The first version of the global dynamic model was in ref. 4. The discussion explains the major modules of the model, and describes the major revisions since the 2013 version. (The current version of the DICE-2016R is available at [www.econ.yale.edu/~nordhaus/homepage/DICEmodels09302016.htm](http://www.econ.yale.edu/~nordhaus/homepage/DICEmodels09302016.htm).)

The DICE model views climate change in the framework of economic growth theory. In a standard neoclassical optimal growth model known as the Ramsey model, society invests in capital goods, thereby reducing consumption today, to increase consumption in the future. The DICE model modifies the Ramsey model to include

climate investments, which are analogous to capital investments in the standard model. The model contains all elements from economics through climate change to damages in a form that attempts to represent simplified best practice in each area.

**Equations of the DICE-2016R Model.** Most of the analytical background is similar to that in the 2013R model, and, for details, readers are referred to ref. 3. Major revisions are discussed as the equations are described.

The model optimizes a social welfare function,  $W$ , which is the discounted sum of the population-weighted utility of per capita consumption. The notation here is that  $V$  is the instantaneous social welfare function,  $U$  is the utility function,  $c(t)$  is per capita consumption, and  $L(t)$  is population. The discount factor on welfare is  $R(t) = (1+\rho)^{-t}$ , where  $\rho$  is the pure rate of social time preference or generational discount rate on welfare.

$$W = \sum_{t=1}^{T_{\max}} V[c(t), L(t)]R(t) = \sum_{t=1}^{T_{\max}} U[c(t)]L(t)R(t). \quad [1]$$

The utility function has a constant elasticity with respect to per capita consumption of the form  $U(c) = c^{1-\alpha}/(1-\alpha)$ . The parameter  $\alpha$  is interpreted as generational inequality aversion.

Net output is gross output reduced by damages and mitigation costs,

$$Q(t) = \Omega(t)[1 - \lambda(t)]Y(t). \quad [2]$$

In this specification,  $Q(t)$  is output net of damages and abatement, and  $Y(t)$  is gross output, which is a Cobb–Douglas function of capital, labor, and technology. Total output is divided between total consumption and total gross investment. Labor is proportional to population, whereas capital accumulates according to an optimized savings rate.

## Significance

The most important single economic concept in the economics of climate change is the social cost of carbon (SCC). At present, regulations with more than \$1 trillion of benefits have been written for the United States that use the SCC in their economic analysis. The DICE model (Dynamic Integrated model of Climate and the Economy) is one of three integrated assessment models used to estimate the SCC in the United States. The present study presents updated estimates based on a revised DICE model (DICE-2016R). The study estimates that the SCC is \$31 per ton of CO<sub>2</sub> in 2010 US\$ for the current period (2015). This study will be an important step in developing the next generation of estimates of the SCC in the United States and other countries.

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The current version develops global output in greater detail than earlier versions. The global output concept is purchasing power parity (PPP) as used by the International Monetary Fund (IMF). The growth concept is the weighted growth rate of real gross domestic product (GDP) of different countries, where the weights are the country shares of world nominal GDP using current international dollars. We constructed our own version of world output, and this corresponds closely to the IMF estimate of the growth of real output in constant international (PPP) dollars. The earlier model used the World Bank growth figures, but the growth rates by region could not be replicated.

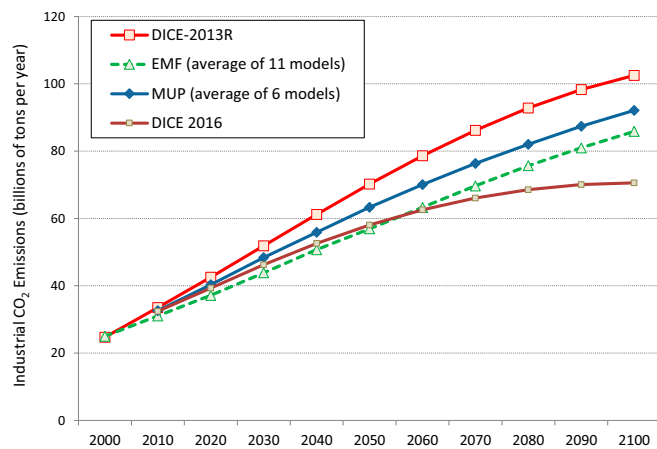
The present version substantially revised both the historical growth estimates and the projections of per capita output growth. Future growth is based largely on a survey of experts conducted by Peter Christensen and colleagues at Yale University. Growth in global per capita output over the 1980–2015 period was 2.2% per year. Growth in global per capita output from 2015 to 2050 is projected at 2.1% per year, whereas that to 2100 is projected at 1.9% per year. The revisions are updated to incorporate the latest output, population, and emissions data and projections. Population data and projections through 2100 are from the United Nations. CO<sub>2</sub> emissions are from the Carbon Dioxide Information Analysis Center and are updated using various sources. Non-CO<sub>2</sub> radiative forcings for 2010 and projections to 2100 are from projections prepared for the IPCC Fifth Assessment.

The additional variables in the production function are  $\Omega(t)$  and  $\Lambda(t)$ , which represent the damage function and the abatement cost function, respectively. The abatement cost function,  $\Lambda(t)$  in Eq. 2, was recalibrated to the abatement cost functions of other IAMs as represented in the Modeling Uncertainty Project (MUP) study (5). The result was a slightly more costly abatement function than earlier estimates.

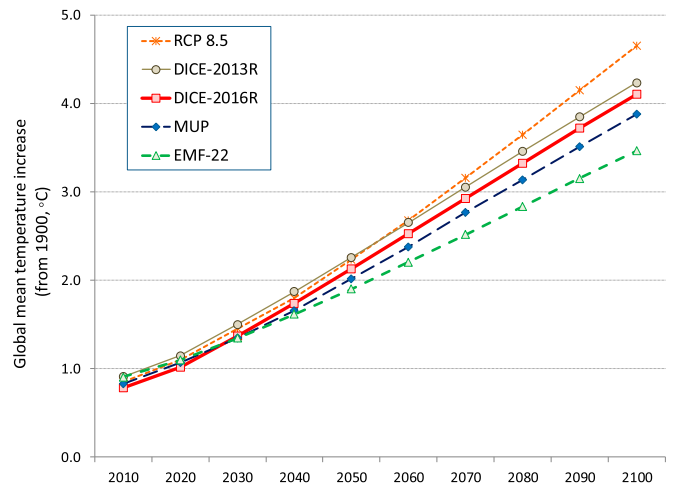
The damage function is defined as  $\Omega(t) = D(t) / [1 + D(t)]$ , where

$$D(t) = \phi_1 T_{AT}(t) + \phi_2 [T_{AT}(t)]^2. \quad [3]$$

Eq. 3 describes the economic impacts or damages of climate change, which is a key component in calculating the SCC. The DICE-2016R model takes globally averaged temperature change ( $T_{AT}$ ) as a sufficient statistic for damages. Eq. 3 assumes that damages can be reasonably well approximated by a quadratic function of temperature change.



**Fig. 1.** Projected industrial CO<sub>2</sub> emissions in baseline scenario. The figure compares the projections of the most recent DICE models and two model comparison exercises. The estimates from the MUP project are from ref. 5, and the EMF-22 estimates are from ref. 14.



**Fig. 2.** Global mean temperature increase as projected by IPCC scenarios and integrated assessment economic models. The figure compares the projections of the most recent DICE models, the IPCC RCP high scenario (RCP 8.5), and two model comparison exercises.

The damage function was revised in the 2016 version to reflect new findings. The 2013 version relied on estimates of monetized damages from ref. 6. It turns out that that survey contained several numerical errors (7). The current version continues to rely on existing damage studies, but these were collected by Andrew Moffat and the author and independently verified (see *Supporting Information* for details). Including all factors, the final estimate is that the damages are 2.1% of global income at a 3 °C warming, and 8.5% of income at a 6 °C warming.

Uncontrolled industrial CO<sub>2</sub> emissions are given by a level of carbon intensity,  $\sigma(t)$ , times gross output. Total CO<sub>2</sub> emissions,  $E(t)$ , are equal to uncontrolled emissions reduced by the emissions reduction rate,  $\mu(t)$ , plus exogenous land-use emissions.

$$E(t) = \sigma(t)[1 - \mu(t)]Y(t) + E_{Land}(t). \quad [4]$$

The model has been revised to incorporate a more rapid decline in the CO<sub>2</sub>–output ratio to reflect the last decade’s observations. The decade through 2010 showed relatively slow decarbonization, with the global CO<sub>2</sub>/GDP ratio changing at –0.8% per year. However, the most recent data indicate a sharp downward tilt, with the global CO<sub>2</sub>/GDP ratio changing at –2.1% per year over the 2000–2015 period (preliminary data). Whether this is structural or the result of climate policies is unclear at this point. For the DICE model, we assume that the rate of decarbonization going forward is –1.5% per year (using the IMF output concept).

The geophysical equations link greenhouse gas emissions to the carbon cycle, radiative forcings, and climate change. Eq. 5 represents the equations of the carbon cycle for three reservoirs.

$$M_j(t) = \phi_{0j}E(t) + \sum_{i=1}^3 \phi_{ij}M_i(t-1). \quad [5]$$

The three reservoirs are  $j = AT, UP$ , and  $LO$ , which are the atmosphere, the upper oceans and biosphere, and the lower oceans, respectively. The parameters  $\phi_{ij}$  represent the flow parameters between reservoirs per period. All emissions flow into the atmosphere. The 2016 version incorporates new research on the carbon cycle. Earlier versions of the DICE model were calibrated to fit the short-run carbon cycle (primarily the first 100 y). Because we plan to use the model for long-run estimates, such as the impacts on the



**Table 2. Regional SCC**

Region	SCC 2015, \$/tCO <sub>2</sub> , 2010 \$	RICE 2010, % global	FUND 2013, % global	PAGE 2011, % global	This study, % global
United States	4.78	10	17	7	15
EU	4.79	12	24	9	15
Japan	1.07	2	3	na	3
Russia	0.91	1	10	na	3
Eurasia	1.56	1	na	na	5
China	6.61	16	8	11	21
India	2.93	12	5	22	9
Middle East	2.16	10	na	na	7
Africa	1.03	11	6	26	3
Latin America	1.87	7	na	11	6
Other high income	1.00	4	na	na	3
Other	2.50	12	[28]	[16]	8
Global	31.21	100	100	100	100

This table distributes the global SCC from Table 1 by region. The first and last columns assume that the SCC is proportional to the discounted value of output in each region over the 2020–2050 period, discounted at a discount rate of 5% per year. na, not available in the source document; tCO<sub>2</sub>, metric tons of CO<sub>2</sub>. Brackets around estimates are total of omitted regions.

in the discussion of Eq. 4) is that the rate of decarbonization has increased in recent years. The lower emissions trend is reflected in the 2016 DICE version but not in most other model projections, which often reflect models constructed several years ago.

Fig. 2 shows the projected temperature trajectories in five different approaches. The results for DICE-2016R are in the middle of the pack after all of the different revisions are included. The DICE results are above those of the Energy Modeling Forum 22 (EMF-22) exercise as well as the central projections from the MUP project (5). The top line is the ensemble average from the Fifth Assessment Report of the IPCC (11) for the Representative Concentration Pathway (RCP) 8.5 scenario. However, the IPCC Representative Concentration Pathway (RCP) 8.5 projection has a higher radiative forcing than the baseline DICE-2016R model. Thus the summary is that the DICE temperature projection is roughly unchanged from the last version and is consistent (although a little lower) than the IPCC RCP8.5 ensemble average.

### Estimates of the SCC

**Definition of the SCC.** Solving Eqs. 1–8 by optimizing the social welfare function ( $W$ ) yields a path of all variables. We then define the SCC at time  $t$  as

$$SCC(t) \equiv \frac{\partial W}{\partial E(t)} \bigg/ \frac{\partial W}{\partial C(t)} \equiv \partial C(t) / \partial E(t). \quad [9]$$

Looking at the middle term, the numerator is the marginal welfare impact of emissions at time  $t$ , and the denominator is the marginal welfare impact of a unit of aggregate consumption in period  $t$ ; this gives the third term of Eq. 9, in which the SCC equals the economic impact of a unit of emissions in terms of  $t$ -period consumption as a numéraire. In actual calculations, we take a discrete approximation to Eq. 9. Note that the SCC is time-indexed because the marginal damage of emissions changes over time.

We have estimated the SCC in the DICE-2016R model for several alternative scenarios. These scenarios reflect differing assumptions about policy and discounting. The units are 2010 US international dollars (that is, in PPP) per metric ton of CO<sub>2</sub> and are expressed in terms of consumption in the given year.

**SCC for Standard DICE Model Parameters.** The central cases for the SCC are shown in the first two rows of Table 1. The first row shows the estimate for the standard DICE model with baseline or current climate policy. The SCC figure here is \$31.2 per ton of CO<sub>2</sub> for emissions in 2015, with the value rising at 3% per year in real terms through 2050. The SCC along an optimized path, shown in row 2, is

**Table 3. Estimates of SCC for 2020 from US Interagency Working Group and comparison with DICE model in 2010 US\$**

Model and scenario	5% per year discount rate on goods	DICE	4% per year discount rate on goods	3% per year discount rate on goods	2.5% per year discount rate on goods
Estimates of 2020 SCC from US Working Group, 2013 (2010\$)					
DICE-2010	12	na	na	40	59
PAGE	23	na	na	74	105
FUND	3	na	na	22	37
Average	13	na	na	45	67
Estimates for different DICE model versions (2010\$)					
DICE-2013R	15	24	26	50	74
DICE-2016R	23	37	41	87	140

Upper rows show estimates of the 2020 SCC from the IAWG. The three models have harmonized outputs, emissions, populations, and ETS distribution and use constant discount rates. Lower rows show the results of the estimates from the two latest versions of the DICE model for the baseline (Table 1) and using constant discount rates.



slightly lower than the baseline path. The difference between the two cases is small because marginal damages change relatively little between the optimal and baseline case.

**Alternative Estimates.** Table 1 shows alternative estimates. We show a calculation for constraining temperature to a  $2\frac{1}{2}$  °C limit in two cases: one with a hard cap of  $2\frac{1}{2}$  °C, and the second where that cap is for an average of 100 y rather than a single period. The average would be a more sensible objective if damages are a function of average rather than peak temperature. (The hard cap is infeasible for a maximum of 2 °C and would only be feasible if technologies were available that allow substantial negative emissions by around 2050.) The SCCs for the two limit cases are \$184 and \$107 per ton of CO<sub>2</sub> in 2015 for the two cases of maximum and average limit.

It is well known that the discount rate has an important impact on the SCC. A closer look shows that the key variable is the “growth-corrected discount rate,” which is the difference between the discount rate on goods and the rate of growth of output (see *Supporting Information* and ref. 2). The estimates of the SCC with different discount rates on goods are shown at the bottom of Table 1. Table 1 also shows the SCC for the discounting procedure proposed in ref. 10. The relationship between the growth-corrected discount rate and the SCC is shown in Fig. 3.

**Regional SCCs.** A few IAMs disaggregate the global SCC into the regional SCCs. These regional estimates represent the marginal damages of emissions for a particular country or region, that is, the SCC when only the damages to that particular region are included in the calculation. These estimates are important for understanding the impacts on individual regions as well as the problem of noncooperative behavior. (In noncooperative behavior, national efforts will be determined by the national SCCs rather than the global SCC and will therefore be much lower; see ref. 12.) Table 2 shows four different sets of estimates of the regional composition of the SCC. The first three are from the three models used by the Interagency Working Group on Social Cost of Carbon (IAWG), and the fourth shows an estimate based on the discounted value of GDP of the regions. One point is clear: The regional estimates are poorly understood, often varying by a factor of 2 across the three models. Moreover, regional damage estimates are highly correlated with output shares ( $R = 0.71$ ).

The dollar estimates of regional SCCs shown in the first numerical column of Table 2 allocate the global SCC based on the output shares. This estimate is used partially because the regional damage estimates are both incomplete and poorly understood. Additionally, regional output shares are well defined and easy to replicate and, in most cases, fall within the estimates of the different models. A key message here is that there is little agreement on the distribution of the SCC by region—except for the important point that each country’s SCC is well below the global total.

**Comparison with the IAWG.** The US government has relied on the work of the IAWG to develop estimates of the SCC (see ref. 13 for different versions). The IAWG concept is conceptually comparable to the baseline in the first row of Table 1. The IAWG combines estimates from three models and multiple scenarios. Table 3 compares the latest round of estimates of the IAWG with estimates from the DICE-2013R and DICE-2016R models for the baseline model and different discount rates. The preferred SCC estimate of the most recent DICE model is about one-fifth lower than the IAWG’s preferred SCC. At comparable discount rates, the DICE model estimate would be roughly twice that of the IAWG.

### Uncertainty About the SCC

The central estimates in Tables 1–3 use the expected values of the parameters such as productivity growth. Developing reliable estimates that incorporate uncertainty has proven extremely

challenging on both methodological and empirical grounds (5). Two major sources of uncertainty about the SCC are “model uncertainty” and “structural uncertainty.” The difference across models in Table 3 shows model uncertainty. These estimates actually underestimate model uncertainty because they have been harmonized by the IAWG for several inputs (discounting, outputs, and temperature sensitivities) but retain differences in other model structures (particularly damage functions). Model uncertainty is more than a factor of 3 for the IAWG’s preferred 3% discount rate.

Structural uncertainty, or uncertainty within models, arises from imprecision in knowledge of structural parameters or variables. The MUP project (5) was the first study to develop harmonized estimates of uncertainties of different models for a variety of models. I replicated the MUP methodology to estimate structural uncertainty about the SCC in the DICE model arising from three sources: productivity growth, equilibrium temperature sensitivity (ETS), and the damage function. The exact approach is described in *Supporting Information*.

That calculation provides an estimated SD of the SCC in 2015 of \$32 per ton of CO<sub>2</sub>. The 10<sup>th</sup> to 90th percentile range of the SCC for 2015 is \$7 to \$77. The IAWG estimates that the ratio of the 95th percentile to the average is 3.0, whereas the current estimate is a ratio of 2.8. Because the IAWG includes only uncertainty about the ETS, it is surprising that the IAWG uncertainty bounds are higher than those in the current model. These estimates confirm that there is extremely large structural uncertainty about the SCC even in a single model.

### Accounting for the SCC Changes Since DICE-2013R

The estimated SCC has increased substantially since the last version, as shown in Table 3. We can decompose the changes by introducing each of the major components one by one. Table 4 accounts for the changes by major revision variable. Other than the adjustment of the damage function, other major changes had the effect of increasing the SCC between 2013 and 2016. The two major changes were the carbon cycle (discussed above) and estimated economic activity.

The reasons for the changes in economic estimates are important to understand. Data revisions have tended to increase measured output because statisticians “find” more output, and because of methodology changes. One important change has been from the movement among IAMs from market exchange rates (MER) (typical in models a decade ago) to PPP. As an example, estimated nominal world output in 2005 with MER was \$46 trillion in the 2006 IMF database. In the 2016 estimate using PPP, world output in 2005 was \$67 trillion, or 50% higher. Because damages are generally proportional to output, increasing output increases the SCC in a proportional fashion.

**Table 4. Accounting for changes in SCC from DICE-2013R**

Version	Model	SCC (2015), 2010 \$	Change, %
1	Dice-2016	31.23	
2	1 + old damages	35.63	14
3	2 + old population	33.36	−6
4	3 + old temp sensitivity	30.58	−8
5	4 + old economics	21.25	−31
6	5 + old carbon cycle	16.01	−25
7	DICE-2013R	17.03	6

The table shows the impact of introducing model changes starting with the 2016 model and ending with the 2013 model in a step fashion. The last column shows the change moving from a later specification to an earlier one. A negative number in the last column is a decrease from 2016 to 2013. For example, introducing “old economics” in version 5 lowers the SCC by 25% relative to DICE-2016. The two major changes are economic assumptions and the carbon cycle (see *Accounting for the SCC Changes Since DICE-2013R* for a discussion).

## Conclusion

As the National Research Council (1) report emphasizes, natural and social scientists need to develop the research base for climate science and economics substantially to refine our estimates of the SCC. Over the last decade, federal regulations with estimated benefits of over \$1 trillion have used the SCC. Although damages, particularly those in

poor regions, have proven most difficult to develop firm estimates for, revisions in the SCC estimates involve many factors other than damages, including the carbon cycle and economic growth assumptions.

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