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INTERMEDIATE FAQ

10th August 2012

# 1 Output

$$Q(t) = \Omega(t)[1 - \Lambda(t)]A(t)K(t)^\gamma L(t)^{1-\gamma}.$$

Output  $Q(t)$  depends on a (constant-returns-to-scale) Cobb-Douglas production function in technology, capital and labor, denoted by  $A(t)$ ,  $K(t)$  and  $L(t)$ , respectively. The capital share,  $\gamma$ , is set to 30%. Output is reduced by a fraction  $\Omega(t) < 1$  due to harms from climate change, and by resources spent on abatement,  $\Lambda(t) < 1$ . Each of these five components of output is discussed below.

## 1.1 Population growth

$$L(t) = L(0) + [L(Tmax) - L(0)] \left( 1 - \frac{1}{e^{L_g \times (t-1)}} \right).$$

The population in period  $t$ ,  $L(t)$  evolves according to the weighted average formula between the initial population in year 2005,  $L(0)$ , and the asymptotic population in the last year we consider,  $L(Tmax)$ . Users choose the asymptotic population  $L(Tmax)$  given the population growth rate,  $L_g$  and the initial population in 2005,  $L(0)$ .

## 1.2 Capital

The amount of capital available for use depends on the depreciated capital from the prior period and the amount saved.

$$K(t) = I(t) + (1 - \delta_K)K(t-1),$$

where  $\delta_K$  is the rate of depreciation of the capital stock. The default level of this  $\delta_K$  is set to 10%. Users can change this to any value between 0.08 and 0.2.

Individuals save a fixed portion of their output,  $I(t) = sQ(t)$ , and output is split between consumption and savings.

$$Q(t) = C(t) + I(t).$$

The model assumes that individuals save 20% of output but users can change this to any value between 15% and 25%. Some versions of DICE solve for the optimal savings rate, but Nordhaus reports that the amount is relatively insensitive to assumptions so we leave it as a fixed, user-chosen parameter.

## 1.3 Total Factor Productivity

Total factor productivity (TFP, or  $A(t)$ ) describes how efficiently capital and labor produce output. The initial value,  $A(0)$ , is set to produce 2005 output given the observed 2005 capital and labor inputs. TFP is assumed to evolve according the equation:

$$A(t) = \frac{0.95 \times A(t-1)}{1 - A_g(t-1)},$$

for  $t \geq 1$  given the initial technology level,  $A(0)$ . The model assumes that productivity growth will slow down in the coming decades. In particular, the TFP growth rate is:

$$A_g(t) = A_g(0) \times \exp(-\Delta_a \times (t-1)),$$

where users choose  $\Delta_a$  which measures the decline rate of this productivity given the initial TFP level of  $A_g(0)$ .

More formally,  $\Delta_a$  is percentage growth rate of  $A_g(t)$ , the growth rate of TFP. To see this note that

$$\frac{d \ln A_g(t)}{dt} = \underbrace{\frac{A_g(t+1) - A_g(t)}{A_g(t)}}_{\text{growth rate in \%}} = -\Delta_a$$

Figure 1 shows how the evolution of TFP changes for a choice of  $\Delta_a$ .

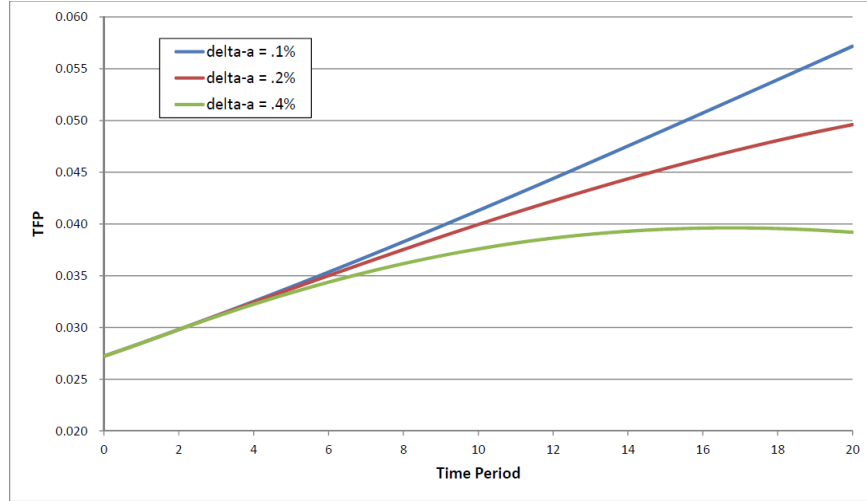


Figure 1: Evolution of TFP for choice of  $\Delta_a$

## 1.4 Damages

The damage function measures the share of usable output after subtracting the harms from temperature increases due to climate change. The default model assumes that the damage function has the following functional form:

$$\Omega(t) = \frac{1}{1 + \pi_2 T_{AT}(t)^\varepsilon}.$$

Users choose  $\pi_2$  and  $\varepsilon$ .  $\varepsilon$  is the exponent on the global mean surface temperature and set to 2 as a default. Users can set  $\varepsilon$  in the range  $[1, 3]$ .  $\pi_2$  can be chosen to be any value between 0.002 and 0.0035 with the default value of 0.0028. Under these default values, the harm from a 2.5 degree temperature change is 1.7% of output, which is based on the estimates in DICE.

In future versions of webDICE, users will be able to choose alternative forms of the damage function such as exponential damages and also choose how damages affect the economy. The existing implementation, following DICE, treats damages as creating unusable output. Harms from climate change affect capital only through a reduction in savings and they do not change the productivity of the economy. Future versions will allow users to choose damages that reduce the capital stock directly or that change the productivity growth.

## 1.5 Abatement costs

$$\Lambda(t) = \theta_1(t)\pi(t)\mu(t)^{\theta_2} = \theta_1(t)\varphi(t)^{1-\theta_2}\mu(t)^{\theta_2}.$$

The abatement cost  $\Lambda(t)$  is the fraction of output spent on keeping emissions below a specified level chosen under a climate policy. It is the cost of reducing emissions of GHGs, measured as a fraction of total output.

There are three components to abatement costs: the emissions control rate  $\mu(t)$ , the participation fraction  $\varphi(t)$ , and the cost of replacing all fossil fuels with carbon-free energy (the backstop technology)  $\theta_1(t)$ . Abatement costs go up with the control rate, go up as participation goes down, and go down as low-carbon energy technology improves.

### 1.5.1 The emissions control rate

The emissions control rate  $\mu(t)$  is the emissions reductions expressed as a fraction of total emissions,  $\mu(t) \in [0, 1]$ . To represent increasing marginal costs,  $\mu(t)$  is raised to the power  $\theta_2$ . The default value of  $\theta_2$  is 2.8. Users can change this number to anything between 2 and 4.

Under the business as usual scenarios,  $\mu(t) = 0$ , because those scenarios assume no controls on emissions. Abatement costs will be positive in two circumstances: if the model is run in optimization mode or if the user sets emissions controls. In optimization mode, the model solves for the path of  $\mu(t)$  that maximizes the discounted sum of utility over time.

If users set their own controls, they can set carbon caps in three years, 2050, 2100, and 2150. The caps are specified as a percentage of emissions in 2005. Denote these percentages as  $e2050cap$ ,  $e2100cap$ , and  $e2150cap$ , respectively. The model implements these choices by solving for  $\mu(t)$  to produce those levels of emissions. Specifically, the model induces the controlled emissions rate  $\mu(t) > 0$  from the carbon caps set by users whenever emissions of a year exceeds the cap in the threshold years of 2050-2100, 2100-2150, and 2150- $Tmax$ . That is, given the equation for industrial emissions (see section 1.6)  $E_{ind}(t) = \sigma(t)[1 - \mu(t)](t)K(t)^\gamma L(t)^{1-\gamma}$ , we set  $\mu(t)$  as:

$$\mu(t) = \begin{cases} 0 & \text{if } E_{ind}(t) < E_{ind}(2005) \times ecap \\ 1 - \frac{E_{ind}(2005) \times ecap}{\sigma(t)A(t)K(t)^\gamma L(t)^{1-\gamma}} & \text{if } E_{ind}(t) > E_{ind}(2005) \times ecap \end{cases}$$

For instance, consider the year 2070. This year should obey the emissions cap of the year 2050. Thus,  $\mu(2070) = 1 - \frac{E_{ind}(2005) \times e2050cap}{\sigma(2070)A(2070)K(2070)^\gamma L(2070)^{1-\gamma}}$  if  $E_{ind}(2070) > E_{ind}(2005) \times e2050cap$ . If we have more emissions than the standard, we would like to decrease it by controlling the reduction rate of  $\mu(t)$ .

One drawback is that the model uses step function setting caps in each threshold year and assuming that those caps apply for future years, until another threshold year comes. Abrupt reduction of emissions might be more costly to implement than smooth reduction in practice. The step function, however, reflects common practice in treaties which specify target years.

### 1.5.2 The participation fraction

The participation fraction,  $\varphi(t) \in [0, 1]$  is the fraction of emissions that are subject to control. For example, if less than all countries participate in an emissions control regime or some industries are exempt,  $\varphi(t) < 1$ . To represent the increasing marginal costs of controlling emissions when participation is less than full, this rate is raised to  $1 - \theta_2$ , which (after adjusting for the sign) is the same marginal costs as the emissions control rate. We can think of  $\varphi(t)^{1-\theta_2}$  as the participation markup in abatement costs.

Users specify the participation fractions for the years 2015 and 2205. The model interpolates an increasing fraction of participation for the period between 2015 and 2205 according to:

$$\varphi(t) = \begin{cases} \varphi(1) & \text{if } t = 1 \\ \varphi(21) + [\varphi(2) - \varphi(21)] \times \exp(-DFE \times (t - 2)) & \text{if } t = 2, \dots, 24 \\ \varphi(21) & \text{if } t = 25, \dots \end{cases}$$

The participation fraction in DICE-2007 was motivated by the Kyoto Protocol that was initially adopted in year 1997 and entered into force in 2005. Under the Kyoto, 37 Annex I countries committed themselves to a reduction of greenhouse gases in phase I. The participation fraction in 2005 allows DICE to model this. The fraction can change in 2015 to represent a possible extension and modification of the Kyoto protocol. The final target allows the model to consider long term effects with gradually increasing participation.

### 1.5.3 Backstop technology

The final component,  $\theta_1(t)$ , is the cost of replacing all fossil fuels with clean energy at time  $t$ , called the backstop technology. Its initial cost of the backstop technology is set to \$1,170/ton  $CO_2$ . That is, if  $\mu(0)$  were set to be 1, abatement costs would be emissions multiplied by \$1,170. The cost of the

backstop technology is assumed to decline by \$585/ton  $CO_2$  to a final value that is half the initial value under the default. The price of the backstop technology evolves according to:

$$\theta_1(t) = \left[ \frac{BC(0) \times \sigma(t)}{\theta_2} \right] \times \left[ \frac{ratio - 1 + \exp(-BC_g(0) \times (t - 1))}{ratio} \right].$$

If  $BC(reduct)$  is the dollar decline in the price of the backstop technology between the current period and the final period,  $ratio = BC(0)/BC(reduct)$ . (This formulation, while awkward, follows the notation in DICE 2007.) Users can set  $ratio$  and the rate of decline,  $BC_g(0)$ , based on their views about how fast we will develop clean energy. The defaults are  $ratio = 2$  and  $BC_g(0) = 5\%$ .

The marginal cost of abatement at a control rate of 100% is equal to the backstop price for each year. To see, this note that:

$$\begin{aligned} BC(t) = MC(\Lambda)|_{\mu(t)=1} &= \frac{\partial \Lambda}{\partial \mu(t)}|_{\mu(t)=1} = \theta_1(t)\theta_2 \\ &= \underbrace{BC(0)}_{(1)} \times \underbrace{\sigma(t)}_{(2)} \times \underbrace{\left[ \frac{ratio - 1 + \exp(-BC_g(0) \times (t - 1))}{ratio} \right]}_{(3)}. \end{aligned}$$

The backstop cost in period  $t$  is proportional to the three factors. Factor (1) is a initial condition that can be based on data. Factor (2) is the carbon intensity, and is decreasing over time; as economy gets less carbon intense, the marginal cost of shifting all the fossil fuels into alternative energy decreases. Factor (3) represents improvement in the backstop technology, such as less expensive solar power. Notice  $\frac{\partial(3)}{\partial t} < 0$  so that (3) declines in time, reducing the cost of the backstop.

To understand how setting  $ratio$  determines the final price, note that at  $t = 1$ ,  $BC(1) = BC(0) \times \sigma(1)$ , which is the current backstop price multiplied by the emissions intensity. As  $t \rightarrow \infty$ ,  $BC(t) \rightarrow [BC(0) - BC(reduct)] \times \sigma(t)$ . The greater the reduction in costs, the lower the  $ratio$ . When  $ratio = 1$ , the final cost of the backstop technology is \$0. When  $ratio = 2$ , (as in the default), the final cost of the backstop technology is half the initial cost, and similarly for higher values of  $ratio$ . Figure 2 illustrates.

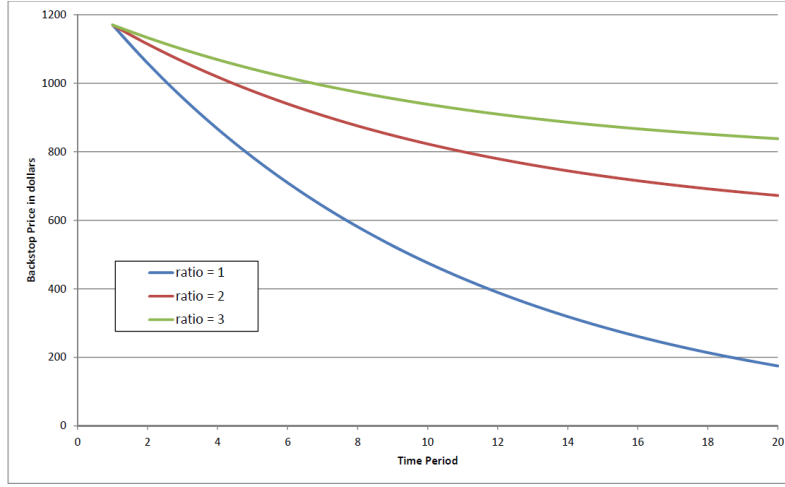


Figure 2: Evolution of backstop price for choice of *ratio*,  $BC_g(0) = 10\%$

## 1.6 Carbon intensity and emissions

$$E_{Ind}(t) = \sigma(t)[1 - \mu(t)]A(t)K(t)^\gamma L(t)^{1-\gamma}.$$

Economic activity produces emissions. Emissions are equal to the carbon intensity of the economy,  $\sigma(t)$  multiplied by output, and reduced by emissions controls  $\mu(t)$ . The carbon intensity of the economy is assumed to decline (even without emissions policies) due to improvements in energy efficiency, according to:

$$\begin{aligned}\sigma(t) &= \frac{\sigma(t-1)}{1 - \sigma_g(t)}, \\ \sigma_g(t) &= -\sigma_g(0) \times \exp(-\sigma_{d1} \times (t-1)),\end{aligned}$$

given  $\sigma(0)$ .  $\sigma_g(t) < 0$  is the rate of decarbonization. This rate of carbon-saving technological change is assumed to slow down at the user-chosen value of  $\sigma_{d1}$ . The default is 0.003. Figure 3 shows the evolution of carbon intensity for the choice of  $\sigma_{d1}$ .

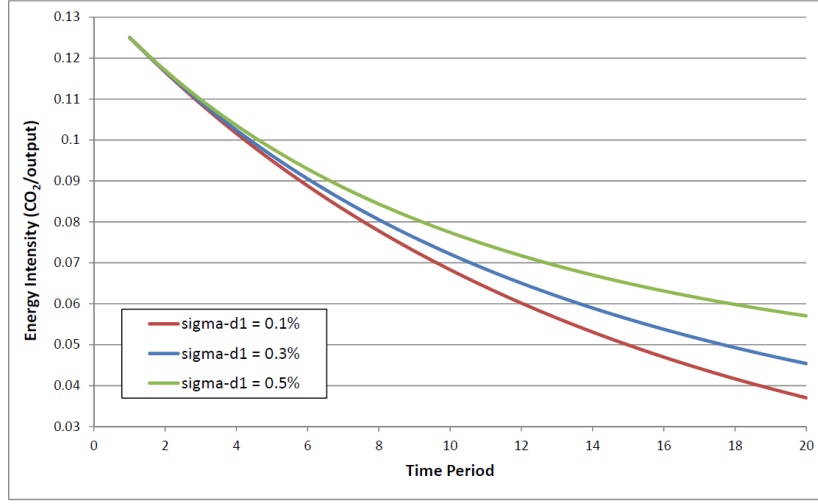


Figure 3: Evolution of energy intensity for choice of  $\sigma_{d1}$

Total emissions are limited to the known fossil fuel reserves, set at a default value of 6,000 gigatons of carbon dioxide:  $CCum \geq \sum_{t=0}^{T^{max}} E_{Ind}(t)$ . Users can increase this value based on their views about likely discoveries of additional fossil fuel reserves.

Emissions also arise from deforestation. Deforestation is currently exogenous to the model and is assumed to decline over time according to

$$E_{Land}(t) = E_{Land}(0)(1 - 0.1)^{t-1}.$$

Emissions can be reduced through a wide range of policies parameterized by the emission caps of years 2050, 2100, and 2150.

## 2 Carbon cycle

Placeholder for carbon cycle discussion

## 3 Optimization

Users can run the model in either simulation mode or optimization. In simulation mode, the model projects outcomes based on the chosen parameter values. In optimization mode, the model finds the emissions control rate  $\mu(t)$  that maximizes the discounted sum of utility given the assumptions in the model about output, emissions, and harm. It then translates these controls into the equivalent carbon tax rate, which is:



$$\tau(t) = \theta_1(t)\mu(t)^{\theta_2-1},$$

(assuming participation is complete, as it would be under an optimal control regime).

### 3.1 Objective Function

The objective function in the model is the discounted sum of utility:

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

Utility is

$$U[c(t), L(t)] = L(t) [c(t)^{1-\alpha}/(1-\alpha)].$$

where  $\alpha$  is the elasticity of marginal utility.  $\alpha$  is set by default to be 2 but users can set it between 1 and 3. Higher values of  $\alpha$  mean that marginal utility declines faster with increases in income.  $c(t) = C(t)/L(t)$  is per capita consumption.

$R(t) = 1/[(1 + \rho)^{(10 \times (t-1))}]$  is the discount factor applied to utility. It is based on  $\rho$ , the pure rate of time preference or the utility discount rate.  $\rho$  is set by default to be 1.5% based on the value used in DICE, but users can set it to be any value between 0 and 4.

The discount rate is one of the most controversial components of climate policy as it in part determines the trade-offs between present and future generations. In addition, because it acts exponentially, small changes in its value can have large changes in policy. For this reason, we suggest users choose their preferred value but also to test how optimal policies change when they choose different values.

Our default values,  $\rho = 1.5\%$  and  $\alpha = 2$ , combined with the implicit growth rate 2% using the default parameters, imply real return to capital of 5.5%. This can be changed by changing  $\rho$  and  $\alpha$  as well as changing default parameters that affect growth.

### 3.2 Constraints

To be implemented

## 4 Computational considerations

The model is implemented in MatLab. The source code can be found here [\[link\]](#). Nordhaus's original model was written in both GAMS and Excel and can be found here [\[link\]](#). We chose MatLab because it

is widely used and contains robust optimization routines. Optimization uses the `fmincon` optimization function.

The model uses 10-year time steps and runs for 60 periods. We only display output for the first 200 years. Simulating the economy for 200 years is highly speculative so displays of results this far in the future need to be understood as a way of understanding the possible effects of assumptions rather than a prediction about what will actually happen. The model runs for 600 years primarily so that in optimization mode, what happens in the final periods has little effect on earlier optimization choices.