

# Climate Change and Growth

## Stochastic IAMs in Dynare

### Handout Baby DICE

## A Baby Decentralized Integrated Assessment Model

This section introduces a stripped-down version of the DICE model that we adapt into a dynamic stochastic general equilibrium (DSGE) framework. Our goal is to demonstrate how climate dynamics can be integrated into a macroeconomic model that is both decentralized and subject to structural shocks, two key ingredients of standard DSGE modeling.

To this end, we construct a simple Real Business Cycle (RBC) model enriched with climate components. We refer to this as a “Baby Decentralized IAM”. The model retains the core economic structure of an RBC framework while incorporating climate-related externalities in a tractable way.

The exposition proceeds in two parts:

1. First, we outline the **exogenous structural trends**, such as carbon emissions, temperature dynamics, and potential technological shifts which are crucial in shaping the long-term evolution of the economy and the environment.
2. Then, we introduce the **decentralized core** of the model, featuring households and firms making optimizing decisions in the presence of climate damages and exogenous shocks.

The model is deliberately kept minimalistic to make it easily extensible, you are encouraged to build upon this structure in your own work. Our solution strategy diverges from traditional log-linearization approaches common in tools like Dynare. Instead, we adopt a method suitable for handling structural trends and nonlinear dynamics inherent in climate-economy interactions.

For a more detailed exposition of the methodology; merging IAM components with DSGE techniques in a Dynare-compatible format, see Jondeau et al. (2022) and Sahuc et al. (2025).

## The Exogenous Component of the Model

As in the original DICE framework, we begin by specifying a set of exogenous processes that drive the long-term trajectory of the economy and the climate. These exogenous variables are not influenced by the decisions of agents within the model. Their deterministic paths are particularly useful for embedding socioeconomic scenarios such as those defined by the Shared Socioeconomic Pathways (SSPs) into a general equilibrium framework.

**1. Productivity with declining growth.** We assume that total factor productivity  $z_t$  grows over time, but at a decaying rate. Specifically, we posit:

$$\begin{aligned} z_t &= (1 + g_{z,t}) z_{t-1} \\ g_{z,t} &= (1 - \delta_z) g_{z,t-1} \end{aligned}$$

where  $g_{z,t}$  is the time-varying productivity growth rate and  $\delta_z \in (0, 1]$  is the decay rate. This setup implies that  $g_{z,t} \rightarrow 0$  over time, and thus  $z_t$  converges to a finite level  $z_\infty$ , ensuring the existence of a steady state in the long run.

**2. Population dynamics.** We model population  $l_t$  as converging gradually toward a long-run terminal level  $l_\infty > 0$ :

$$l_t = l_{t-1}^\ell \cdot l_\infty^{1-\ell}$$

where  $\ell \in (0, 1]$  governs the speed of convergence. This simple deterministic process ensures that the population asymptotically approaches a stable level, reflecting demographic transitions commonly featured in IAM scenarios.

**3. Emission intensity.** Carbon emissions per unit of output are governed by an exogenous trend capturing increasing energy efficiency or decarbonization:

$$\sigma_t = (1 - \delta_\sigma) \sigma_{t-1}$$

with  $\delta_\sigma \in (0, 1]$ . As  $\sigma_t \rightarrow 0$ , emissions per unit of output gradually decline over time, even in the absence of explicit mitigation efforts.

**4. Abatement cost.** We introduce a stylized representation of the cost of emission reduction:

$$\begin{aligned} \theta_{1,t} &= p_b \cdot \sigma_t \cdot q_t / \theta_2 \\ q_t &= (1 - \delta_\theta) q_{t-1} \end{aligned}$$

Here,  $p_b$  is the so-called *backstop price*—the marginal cost of abating the last ton of carbon to achieve net-zero emissions and  $\theta_2$  is a scaling parameter. The process  $q_t$  captures technological progress in abatement technologies, with  $\delta_\theta \in (0, 1]$  being the rate at which costs fall. Over time, as  $q_t \rightarrow 0$ , the marginal cost of abatement  $\theta_{1,t}$  vanishes, representing long-run convergence to cheap clean technologies.

These exogenous processes provide the backbone of the model's long-run structure. In what follows, we integrate them into a decentralized economy with optimizing agents, allowing us to study short-run dynamics and policy responses in a climate-aware DSGE framework.

## Households

The economy is populated by a continuum of identical households indexed by  $i \in [0, l_t]$ , where  $l_t$  denotes the population at time  $t$ .

Each household maximizes expected lifetime utility:

$$\mathcal{W}_{it} = \sum_{s=0}^{\infty} \beta^s \left( \frac{c_{it+s}^{1-\sigma_C}}{1-\sigma_C} - \frac{\chi_{t+s}}{1+\sigma_H} h_{it+s}^{1+\sigma_H} \right)$$

where  $c_{it}$  is consumption,  $h_{it}$  is labor supply,  $\sigma_C > 0$  is the inverse of the intertemporal elasticity of substitution, and  $\sigma_H > 0$  is the inverse of the Frisch elasticity of labor supply. The term  $\chi_t$  captures the disutility weight on labor. Since consumption grows with productivity  $z_t$  while labor remains stationary, we define  $\chi_t = z_t^{1-\sigma_C}$  to ensure that utility grows in a way that supports balanced growth.

The households budget constraint is:

$$r_{t-1}b_{it-1} + w_t h_{it} + tr_{it} = c_{it} + b_{it}$$

where  $b_{it}$  is a one-period risk-free bond,  $r_t$  is the real interest rate,  $w_t$  is the real wage, and  $tr_{it}$  is a lump-sum transfer from the government.

Optimality conditions from the household's problem are standard. The Euler equation governs intertemporal consumption choices:

$$\frac{c_{it+1}^{-\sigma_C}}{c_{it}^{-\sigma_C}} r_t = 1$$

and the intratemporal condition equates the marginal rate of substitution between consumption and labor with the real wage:

$$w_t c_{it}^{-\sigma_C} = \chi_t h_{it}^{\sigma_H}$$

In what follows, we drop the individual index  $i$ , as the representative agent structure implies symmetric behavior across households.

## Firms

The economy features a continuum of perfectly competitive firms indexed by  $j \in [0, l_t]$ . Each firm maximizes profits by choosing labor demand, output, and abatement effort, taking all prices as given. The profit function is:

$$\Pi_{jt} = y_{jt} - w_t h_{jt} - \tau_t e_{jt} - \theta_{1,t} \mu_{jt}^{\theta_2} y_{jt} \quad (1)$$

where  $y_{jt}$  is output,  $h_{jt}$  is labor demand at wage  $w_t$ ,  $\tau_t$  is the carbon tax applied to emissions  $e_{jt}$ , and  $\theta_{1,t} \mu_{jt}^{\theta_2}$  denotes abatement costs, which scale with output. The parameter  $\theta_2 > 1$  ensures strict convexity in the abatement effort  $\mu_{jt} \in [0, 1]$ , meaning that marginal abatement costs increase with effort. The cost function captures no learning-by-doing: the marginal cost of abatement rises over time until cleaner technologies arrive exogenously through  $\theta_{1,t} \rightarrow 0$ .

Output is produced using a linear technology:

$$y_{jt} = \varepsilon_t^z z_t \Omega(M_{t-1}) h_{jt} \quad (2)$$

where the cyclical component of TFP ( $\varepsilon_t^z = 1 - \rho_z + \rho_z \varepsilon_{t-1}^z + \eta_t^z$ ),  $z_t$  is deterministic component of total factor productivity and  $\Omega(M_{t-1})$  is a damage function that reduces productivity as a function of the atmospheric carbon stock  $M_{t-1}$ . Following ?, we assume:

$$\Omega(M) = \exp(-\gamma M)$$

with  $\gamma > 0$ . This exponential form captures the non-linear impact of climate change on productivity.

Emissions are proportional to output, net of abatement effort:

$$e_{jt} = \sigma_t(1 - \mu_{jt})y_{jt} \quad (3)$$

Here,  $\sigma_t$  captures emission intensity, which falls exogenously over time due to energy efficiency improvements. In the absence of a carbon tax ( $\tau_t = 0$ ), the firm has no private incentive to abate, since it is atomistic and does not internalize the effect of its emissions on aggregate carbon stocks or damages.

Substituting emissions and the production function into the profit expression gives:

$$\max_{\{y_{jt}, \mu_{jt}\}} \left( 1 - \frac{w_t}{z_t \Omega(M_{t-1})} - \tau_t \sigma_t (1 - \mu_{jt}) - \theta_{1,t} \mu_{jt}^{\theta_2} \right) y_{jt}$$

The firm's first-order conditions are:

$$\begin{aligned} \text{(i) Labor demand / output condition:} \quad & \left( 1 - \tau_t \sigma_t (1 - \mu_{jt}) - \theta_{1,t} \mu_{jt}^{\theta_2} \right) z_t \Omega(M_{t-1}) = w_t \\ \text{(ii) Abatement effort:} \quad & \mu_{jt}^{\theta_2-1} = \frac{\tau_t \sigma_t}{\theta_2 \theta_{1,t}} \end{aligned}$$

These expressions characterize the optimal behavior of firms facing climate policy and damages. The abatement decision reflects a trade-off between paying the carbon tax and investing in emission reductions, with stronger incentives to abate when the carbon tax  $\tau_t$  is high, emission intensity  $\sigma_t$  is high, or technology makes abatement cheap (low  $\theta_{1,t}$ ).

## Climate

The climate block of the model is governed by a system of backward-looking difference equations, which resemble a vector autoregression (VAR) process. In general, climate dynamics can be expressed as:

$$\mathbf{C}_t = \Phi_C \mathbf{C}_{t-1} + \Phi_E E_t$$

where  $\mathbf{C}_t$  is a vector of climate state variables (typically including atmospheric temperature, carbon stocks in various reservoirs, or radiative forcing). The matrix  $\Phi_C$  captures the persistence and cross-effects across these compartments. The term  $E_t$  are the inflow of emissions and enter the climate system via  $\Phi_E$ .

To keep things tractable, we reduce the system to a single equation for the atmospheric carbon stock  $M_t$ , which evolves according to:

$$M_t = (1 - \delta_m)M_{t-1} + \chi_m \int_0^t e_{jt} \, dj$$

Here,  $\delta_m \in [0, 1]$  is the natural decay rate of atmospheric carbon, and  $\chi_m = \frac{3}{11}$  is a physical conversion factor translating gigatons of CO<sub>2</sub> into pure carbon units. This conversion is necessary because climate dynamic – particularly radiative forcing and the greenhouse effect – are governed by the carbon content, not the dioxide molecule. If  $\delta_m = 0$ , atmospheric carbon accumulates permanently, leading to an endogenous climate trend (an ever-worsening path, possibly requiring degrowth to stabilize). If  $\delta_m > 0$ , then emissions eventually decay, and the system can stabilize over time as emissions  $e_{jt} \rightarrow 0$ , implying  $M_t \rightarrow M_\infty$ . This formulation can easily be extended to multi-compartment carbon models or to include temperature dynamics, if needed for policy evaluation or scientific realism.

## Government

We consider a government that imposes an exogenous carbon tax  $\tau_t$  on firm-level emissions. In contrast to the DICE model, where the carbon price is derived endogenously from a social planner's problem (e.g., via Ramsey allocations), here the tax path is taken as given. The government redistributes carbon tax revenues to households through lump-sum transfers and maintains a balanced budget. The government's budget constraint is:

$$r_t \int_0^{l_t} b_{it-1} di + \int_0^{l_t} tr_{it} di = \tau_t \int_0^{l_t} e_{jt} dj + \int_0^{l_t} b_{it} di$$

Under the assumption of zero net asset supply:

$$\int_0^{l_t} b_{it} di = 0$$

the government's role reduces to collecting carbon revenues and rebating them as lump-sum transfers. This setup isolates the allocative effects of carbon taxation without introducing additional government financing frictions. We now have all the building blocks necessary to define the equilibrium and study the transition dynamics of this decentralized integrated assessment model.

## General Equilibrium

The general equilibrium of this economy is defined by a sequence of prices  $\{w_t, r_t\}_{t=t_0}^{\infty}$ , policies  $\{\tau_t\}_{t=t_0}^{\infty}$ , and allocations  $\{c_t, h_t, b_t, y_t, \mu_t, e_t\}_{t=t_0}^{\infty}$  such that:

- Households maximize lifetime utility subject to their budget constraint,
- Firms maximize profits given technology, prices, and climate damages,
- The government respects its intertemporal budget constraint and levies an exogenous carbon tax,
- All markets clear in aggregate.

We now define the aggregate conditions that characterize this equilibrium.

**Goods Market.** Output is entirely consumed in equilibrium. Aggregate output is the sum of firm-level output over the population of firms:

$$Y_t = \int_0^{l_t} y_{jt} dj, C_t = \int_0^{l_t} c_{it} di$$

Market clearing requires:

$$Y_t = C_t + \theta_{1,t} \mu_t^{\theta_2} Y_t$$

**Labor Market.** Labor demand by firms equals labor supply by households:

$$\int_0^{l_t} h_{jt} dj = \int_0^{l_t} h_{it} di$$

Letting  $h_t$  denote the representative labor input per agent, we write:  $h_t = \int_0^{l_t} h_{jt} dj = \int_0^{l_t} h_{it} di$ .

**Emissions.** Aggregate emissions are determined by firm-level emissions across the economy:

$$E_t = \int_0^{l_t} e_{jt} dj$$

This quantity enters the carbon dynamics equation governing the stock of atmospheric carbon.

The equilibrium is recursive: given the exogenous state variables  $\{z_t, l_t, \sigma_t, \chi_t, \theta_{1,t}\}$ , the endogenous state  $M_{t-1}$ , and policy path  $\{\tau_t\}$ , prices and allocations adjust to ensure that households and firms optimize and all markets clear.

## Summary

To solve the model numerically using a perfect foresight solver, we first detrend the endogenous variables. While detrending is not strictly required for convergence, it significantly improves numerical stability and speed. The reason is simple: large or fast-growing variables (e.g., output or consumption) generate mechanically large residuals in the solution algorithm, even if the model is well-specified. Detrending brings all variables to a scale consistent with stationarity and helps the solver (which uses residual minimization) converge more quickly and accurately.

Let us define detrended variables per effective worker as:

$$\hat{c}_t = \frac{C_t}{z_t l_t}, \quad \hat{y}_t = \frac{Y_t}{z_t l_t}, \quad \hat{\tau}_t = \frac{\tau_t \sigma_t}{\theta_2 \theta_{1,t}}, \quad \hat{w}_t = \frac{w_t}{z_t},$$

We now write the key equilibrium conditions in detrended form:

$$\begin{aligned} \text{Euler equation:} \quad & r_t = \left[ (1 + g_{z,t+1}) \frac{\hat{c}_{t+1}}{\hat{c}_t} \right]^{\sigma_C} \\ \text{Labor-leisure optimality:} \quad & \hat{w}_t = \chi h_t^{\sigma_H} \hat{c}_t^{\sigma_C} \\ \text{Production:} \quad & \hat{y}_t = \Omega(M_{t-1}) h_t \\ \text{Firm optimality (wage condition):} \quad & \hat{w}_t = \left( 1 - \theta_{1,t} \left( \hat{\tau}_t \theta_2 (1 - \mu_t) + \mu_t^{\theta_2} \right) \right) \Omega(M_{t-1}) \\ \text{Abatement effort:} \quad & \mu_t = \hat{\tau}_t^{1/(\theta_2 - 1)} \\ \text{Aggregate emissions:} \quad & E_t = \sigma_t (1 - \mu_t) \hat{y}_t z_t l_t \\ \text{Carbon dynamics:} \quad & M_t = (1 - \delta_m) M_{t-1} + \chi_m E_t \\ \text{Resource constraint:} \quad & \hat{y}_t = \hat{c}_t + \theta_{1,t} \mu_t^{\theta_2} \hat{y}_t \\ \text{TFP shock:} \quad & \varepsilon_t^z = 1 - \rho_z + \rho_z \varepsilon_{t-1}^z + \eta_t^z \end{aligned}$$

As in Sahuc et al. (2025), we control tax path as follows:

$$\hat{\tau}_t = \varphi \hat{\tau}_t^*$$

where  $\hat{\tau}_t^*$  is the tax path consistent with Paris Agreement.

These equations are solved jointly with the exogenous trends:

$$\begin{aligned}
z_t &= (1 + g_{z,t})z_{t-1} \\
g_{z,t} &= (1 - \delta_z)g_{z,t-1} \\
l_t &= l_{t-1}^\ell \cdot l_\infty^{1-\ell} \\
\sigma_t &= (1 - \delta_\sigma)\sigma_{t-1} \\
\theta_{1,t} &= \frac{p_b \cdot \sigma_t \cdot q_t}{\theta_2} \\
q_t &= (1 - \delta_\theta)q_{t-1}
\end{aligned}$$

This completes the logics of the model. The system can now be solved as a perfect foresight transition path starting from an initial carbon stock  $M_{t_0-1}$  and policy path  $\{\tau_t\}_{t \geq t_0}$ . The model is readily implementable in Dynare.

## A Modified Dynare code for Climate Dynamics

Recall that we need to think our model outside the usual steady state approach. Our dynamic problem is an extension of ? to deal with trends:

$$\tilde{y}_t = g_\Theta(y_0, y_\infty, 0) \quad (4)$$

$$y_t = \mathbb{E}_{t,t+S} \{g_\Theta(y_{t-1}, \tilde{y}_{t+S+1}, \varepsilon_t)\} \quad (5)$$

$$\varepsilon_t \sim \mathcal{N}(0, \Sigma_\varepsilon) \quad (6)$$

where  $\{\tilde{y}_t\}_{t=1}^T$  is the deterministic (transitional component) path from given state  $y_0$  up to steady state  $y_\infty$ , while  $\{y_t\}_{t=1}^T$  is the stochastic path with innovations. In what follows  $\mathbb{E}_{t,t+S}\{\cdot\}$  refers to expectation horizon  $S$  for updating the path when a shock emerge.

### Model definition

Define the model equations, calibration as usual, including trends (see `B_RBC/model_file.mod`).

**Initial vector:** Next comes definition of initial state vector  $y_0$  which are constant terms set by user:

```

1  endval;
2  Z = Z0;
3  L = L0;
4  gZ = gZ0;
5  M = M0;
6  delthet = delthet0;
7  THETA1 = THETA0;
8  y = y0;
9  SIG = SIG0;
10 end;
```

**Terminal vector:** we next define the terminal vector, the true steady state  $y_\infty$  of the model that the model will reach (including the effects of climate change).

```

1 steady_state_model;
2 chi = 1;
3 s_a = 1;
4 (...)
5 end;

```

**Simulations Options.** Finally, the set of options, coding the time of the simulation  $T = 3,000$ , the initial date  $t = 0$  (here 1984Q4), the size of expectations window  $S = 100$ , the vector of surprises  $\varepsilon_t$ .

```

1 options_.initial_guess_path = 'guess_path';
2 options_.expectation_window = 100;
3 options_.forward_path      = 3000;
4 options_.surprise_shocks   = logical(ones(M_.exo_nbr,1));
5 options_.surprise_shocks(strcmp(M_.exo_names,'e_tau'))=logical(0);
6 options_.dates0            = dates('1984Q4');

```

**Carbon tax path.** Finally we also compute the path of the expected carbon tax:

```

1 idtau          = strmatch('e_tau',M_.exo_names,'exact');
2 id_now         = find(exo_init_ts.dates==dates('2023Q3')+1);
3 id_last        = find(exo_init_ts.dates==dates('2100Q1'));
4 id_taxmax      = find(exo_init_ts.dates==dates('2049Q4'));
5 exo_init       = exo_init_ts.data;
6 exo_init(id_now:id_taxmax,idtau) = linspace(0,1,(id_taxmax-id_now)+1);
7 exo_init(id_taxmax:end,idtau)   = 1;
8 exo_init(:,idtau)               = smoothdata(exo_init(:,idtau),'gaussian',10);
9 exo_init_ts                    = dseries(exo_init,exo_init_ts.dates(1),exo_init_ts.name);

```

## Simulations

One can simulate the model easily, see in B\_RBC/run3\_compare\_nz0\_bau\_stochastic.mod

**Deterministic path.** It is computed in two step. First compute the initial guess, which will reduce the computation time:

```

1 [y_guess,oo_,M_] = EP_paths_init(oo_,M_,options_,exo_init_ts);

```

Use the guess to compute the deterministic path:

```

1 [det_bau] = EP_deterministic_path(y_guess,exo_init_ts,oo_,M_,options_);

```

**Stochastic path.** One can introduce some innovations, that we pick into innovations\_ts.

```

1 [sto_bau] = EP_stochastic_path(det_bau,innovations_ts,oo_,...
2 M_,options_,stochastic_dates);

```



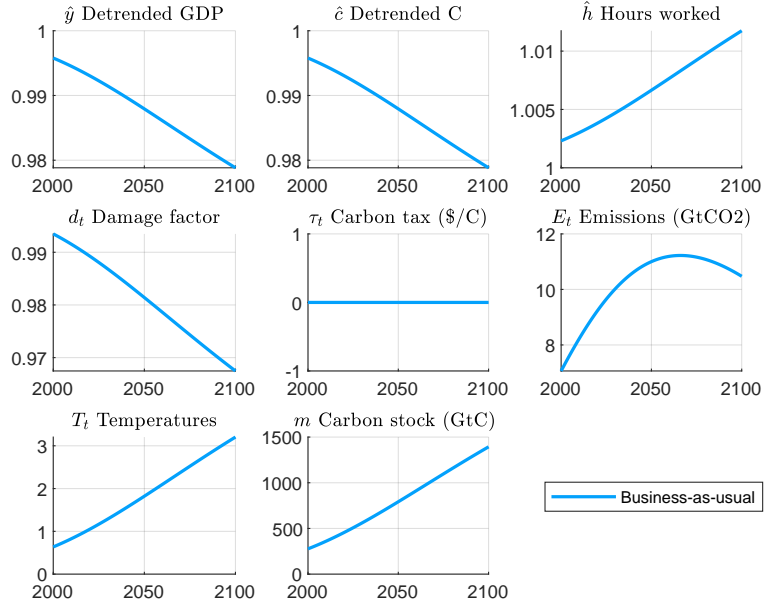


Figure 1: Simulation of the Baby IAM under the Business-as-Usual scenario ( $\varphi = 0$ ).

### A general comment about simulations

- B.RBC/run1\_simple\_bau.mod

We simulate the Baby Integrated Assessment Model (IAM) along a deterministic path under a Business-as-Usual (BAU) scenario, corresponding to a zero abatement policy ( $\varphi = 0$ ) in Figure 1. Climate damages continuously increase as global temperatures rise. These damages affect total factor productivity, leading to lower output per unit of input. As a result, firms experience a decline in productivity and profits. Households face lower wages, which induces them to supply more labor in order to stabilize consumption. However, the overall availability of resources diminishes, and GDP contracts relative to its no-damage trajectory.

- B.RBC/run2\_compare\_nz0\_bau.mod

We compare two deterministic paths: one without climate policy ( $\varphi = 0$ , Business-as-Usual) and one where a carbon tax is fully implemented ( $\varphi = 1$ , Paris Agreement scenario) in Figure 2. Under the policy path, global temperatures are stabilized by 2050 thanks to effective emission reductions. The carbon tax gradually rises to around \$150 per ton, then declines as the carbon intensity of output decreases — making high taxation less necessary. Emissions fall to zero by mid-century. However, the transition is costly: abatement expenditures crowd out consumption, since limited economic resources are redirected toward emission reductions. Households must work more to maintain consumption in the face of rising mitigation efforts and distorted wage dynamics.

- B.RBC/run3\_compare\_nz0\_bau\_stochastic.mod

In this final simulation, the economy is subject to stochastic shocks — specifically, random fluctuations in productivity in Figure 3. As a result, both the Business-as-Usual and Paris

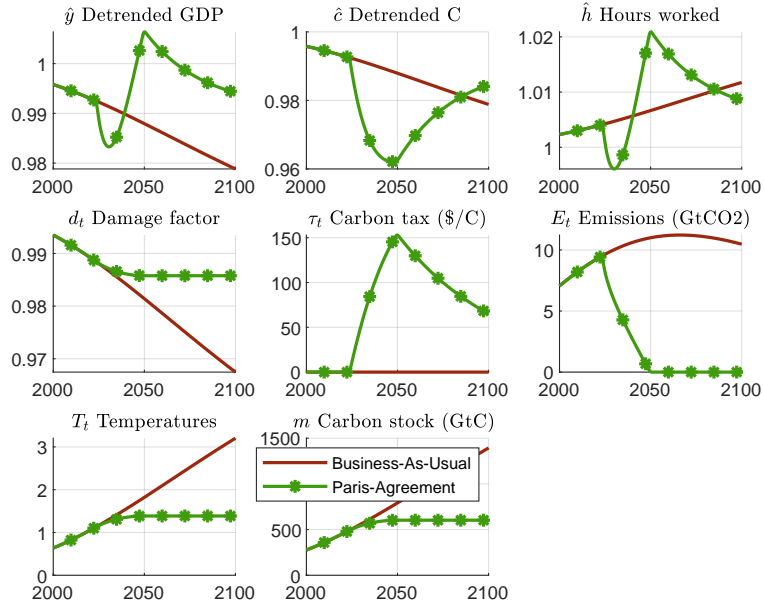


Figure 2: Comparison between Business-as-Usual ( $\varphi = 0$ ) and Paris Agreement ( $\varphi = 1$ ) scenarios.

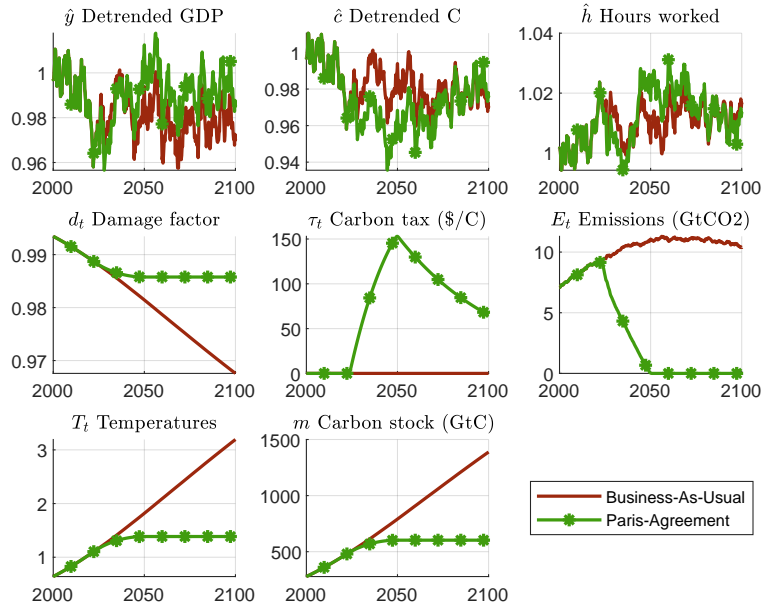


Figure 3: Stochastic simulation of the Baby IAM under Business-as-Usual ( $\varphi = 0$ ) and Paris Agreement ( $\varphi = 1$ ) scenarios.

Agreement trajectories exhibit cyclical behavior. Emissions become volatile and procyclical, responding to the ups and downs of economic activity. However, these fluctuations are not large enough to induce visible variations in the climate block over the horizon considered. Temperature and atmospheric carbon concentrations remain predominantly driven by their long-run trends. Still, uncertainty matters: one could quantify the resulting distribution of outcomes by simulating multiple draws (Monte Carlo sampling) and computing confidence bands for climate and macroeconomic variables.

## References

- Jondeau, E., Levieuge, G., Sahuc, J.-G., and Vermandel, G. (2022). Environmental subsidies to mitigate transition risk.
- Sahuc, J.-G., Smets, F., and Vermandel, G. (2025). The new keynesian climate model.