

# Macro-financial transition risks along mitigation pathways: evidence from a hybrid agent-based integrated assessment model

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1	Macro-financial transition risks along mitigation pathways: evidence
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#### Abstract

Although the case for a swift climate transition is clear, its macro-financial viability remains un-15 certain. To shed light on the macroeconomic and financial response to deep mitigation trajecto-16 ries controlled by carbon pricing, we integrate a process-based integrated assessment model into a 17 macroeconomic agent-based model. The hybrid framework allows translating energy systems trans-18 formations into macro-financial outcomes at business cycle frequency and volatility. The results 19 reveal that rapid transitions induced by fast-growing carbon prices significantly impact unemploy-20 ment, inflation, and income distribution. Stabilization policies reduce these economic fluctuations, 21 though not completely so in 1.5°C compatible scenarios. Our paper emphasizes the need for coordi-22 nating climate and macroeconomic policy during decarbonization. Additionally, it showcases how 23 model integration can lead to a better understanding of the economic implications of low-carbon 24 futures. 25

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As countries commit to decarbonisation plans, questions around implementation and robust policy 26 design grow in importance. The current consensus is that the world possesses the technology and 27 economic capacity to switch to low-carbon options in many sectors (IPCC, 2022). However, much 28 less is understood about the macroeconomic and financial repercussions of climate neutrality goals 29 at the frequencies of interest to policy-makers (Battiston et al., 2021; Semieniuk et al., 2021). This 30 is a major shortcoming of existing model-based assessments, given the importance of macroeconomic 31 conditions for the political and public support of climate policies and for effective policy design aimed 32 at smoothing the transition and making it inclusive. 33

The major causes of this limited capacity are methodological and disciplinary boundaries. Model-34 based assessments of decarbonization policies - especially those performed at the community science 35 level - have focused on technological and sectoral strategies as the main outcome variables. Models sup-36 porting these assessments, including detailed-process Integrated Assessment Models (IAMs) (Weyant, 37 2017), typically feature a stylised representation of economic and financial dynamics (Sanders et al., 38 2022). Though some have quantified the implications of decarbonization for dimensions such as com-39 petitiveness, trade, and sectoral employment, many scenarios only use changes in real GDP, typically 40 at very low temporal frequency, to capture transition costs. Short-run dynamics and impacts on unem-41 ployment, balance sheets and the financial system, or inflation are typically not represented. Indeed, 42 none of these macro-financial dimensions is reported in the 1,100 scenarios assessed in the Intergov-43 ernmental Panel on Climate Change's Sixth Assessment Report. Moreover, fiscal or monetary policy 44 responses to macroeconomic costs induced by climate policy are not typically considered in ex-ante 45 policy assessment. At the same time, such information is highly sought after by finance ministries and 46 international organizations (e.g. the Network for Greening the Financial System, NGFS), and tran-47 sition scenarios and their implications are becoming increasingly relevant for private financial sector 48 agents (NGFS, 2023; TCFD, 2023). 49

On the other side, different macroeconomic models have been extended to accommodate energy 50 and climate sides, providing insights into the effects of monetary and fiscal policy for the low-carbon 51 transition, and on the repercussions of moving away from fossil-fuel energy for the macroeconomy. 52 These models include extensions of the dynamic stochastic general equilibrium framework (DSGE; 53 e.g. Annicchiarico and Di Dio, 2015; Diluiso et al., 2020; Carattini et al., 2023; Comerford and Spi-54 ganti, 2023), post-keynesian ecological macroeconomic models (e.g. Dafermos et al., 2018; Monasterolo 55 and Raberto, 2019; Mercure et al., 2018; Semieniuk et al., 2022), macroeconomic agent-based models 56 (MABM; e.g. Lamperti et al., 2018; Wieners et al., 2024; Turco et al., 2023), non-linear behavioural 57 macroeconomic frameworks (e.g. Campiglio et al., 2024) as well as network models (e.g. Gualdi and 58 Mandel, 2019; Stangl et al., 2024; Cahen-Fourot et al., 2021). However, the majority of these ap-59 proaches misses detailed transition dynamics, such as those depicted by process-based IAMs and 60 included in IPCC mitigation pathways. Indeed, they typically feature only a "green" and a "brown" 61 sector. 62

This gap presents an opportunity for fruitful cross-fertilization between modelling methodologies providing diverse yet complementary views on decarbonization dynamics. In this paper we provide - to the best of our knowledge - the first coupling of a macroeconomic agent-based model (DSK) and a process-based IAM (WITCH). Macroeconomic agent-based models offer comprehensive frameworks that integrate both long-term and short-term economic dynamics (Fagiolo and Roventini, 2017; Dawid and Delli Gatti, 2018), encompassing real-financial interactions (Delli Gatti et al., 2010) and balance sheet relationships among according agents (Caippi et al., 2016). In principle, they enable the <sup>70</sup> assessment of transition and climate costs at business cycle frequency, while also capturing growth <sup>71</sup> implications and financial risks (Castro et al., 2020). Additionally, they report on a richer set of micro <sup>72</sup> and macro variables than many other macroeconomic models (e.g. DSGEs), including unemployment, <sup>73</sup> inflation, and distributional variables. Complementarily, IAMs offer a fine-grained depiction of de-<sup>74</sup> carbonization pathways, including the transformation of the energy and other emitting sectors, their <sup>75</sup> mitigation costs, the investment requirements and energy mix of the economy accounting for all major <sup>76</sup> energy technologies.

Soft-coupled models are not a novelty. In the mitigation literature, they have been employed 77 to investigate R&D investment strategies for decarbonization (Aleluia Reis et al., 2023), climate-78 induced financial instability (Battiston et al., 2017; Roncoroni et al., 2021), macroeconomic effects of 79 climate shocks (Yilmaz et al., 2023), and housing renovations decisions (Niamir et al., 2024). Focusing 80 on transition risks, Allen et al. (2020) and Vermeulen et al. (2018) feed NGFS scenarios defined as 81 carbon price and productivity shocks in a multi-country New Keynesian macro model (NiGEM), which 82 is then linked to sectoral and financial models to perform stress tests. This method allows for studying 83 the heterogeneous effects of climate policies across and within sectors and the dynamics of different 84 financial assets. Comparatively, our IAM-MABM approach allows for a wider range of variables to 85 define scenarios and a more detailed representation of the energy sector which, in particular, includes 86 its balance sheet and cost structure. Moreover, our MABM approach allows us to analyze functional 87 (and potentially personal) income distribution feedback, which remains hindered in standard macro 88 models. 89

We use the WITCH<sup>1</sup> model (Bosetti et al., 2006; Emmerling et al., 2016; Drouet et al., 2021) to generate detailed transition pathways. This process-based integrated assessment model combines an inter-temporal Ramsey-type growth framework with a bottom-up representation of the energy sector. The model divides the world into 17 global regions, each playing a non-cooperative game to maximize welfare in response to climate policies. A key decision in this process is how to allocate R&D investments, which can be directed toward improving energy efficiency or developing carbon-free technologies.

The transition pathways produced by WITCH are then fed into the DSK agent-based model.<sup>2</sup> The DSK model depicts out-of-equilibrium economic dynamics, capturing both short-run fluctuations and long-run growth (Lamperti et al., 2018, 2019, 2021; Reissl et al., 2024). It includes seven types of agents interacting across five markets (see Figure 1). Key variables from the WITCH-generated transition scenarios serve as inputs for the DSK model (see Figure 1), allowing for an assessment of the macroeconomic implications of these transition pathways.

We show that an *orderly*, i.e. low unemployment, and *just*, i.e., distributionally balanced, transition are mutually dependent, as the unemployment resulting from aggressive carbon pricing is influenced by how the tax burden is distributed between profit and wage incomes.<sup>3</sup> Furthermore, the unequal impact of the carbon tax on the energy sector presents a potential source of instability. While the carbon tax promotes profitability in renewable energy sectors, offering financial support for the transition, it simultaneously undermines profitability in fossil fuel-based sectors, rendering them more susceptible

<sup>&</sup>lt;sup>1</sup>World Induced Technical Change Hybrid.

 $<sup>^{2}</sup>$  "Dystopian Schumpeter Meeting Keynes", which belongs to the "Keynes + Schumpeter" family of MABMs (e.g. Dosi et al., 2010, 2013, 2017).

 $<sup>^{3}</sup>$ Here we use a loose definition of orderly and just transition. In our setting, an orderly transition is characterized by low unemployment levels, as a proxy for contained macroeconomic imbalances; a just transition is characterized by a relatively high and stable share of labour income, as a proxy for contained socio-economic inequality. See Newell and Mulvaney (2013) and Wang and Lo (2021) for additional discussion.

109 to bankruptcy.

The government can mitigate these dynamics by using carbon tax revenues to manage aggregate demand. Redistributing revenues to wage earners can address distributional effects and limit negative macroeconomic impacts, compensating for wage losses and sustaining aggregate demand.

We also find that the energy transition will require substantial credit provision for the build-up of renewable energy capacity and that fossil-intensive energy sectors will experience reduced profitability due to carbon pricing and the maintenance of costly stranded assets.

Our results contribute to the literature assessing the macroeconomic impacts of climate policies, 116 regarding regressive effects of carbon pricing (Fremstad and Paul, 2019; Callan et al., 2009; Jiang and 117 Shao, 2014; Farrell, 2017; Känzig, 2023) and the emergence of stranded assets (van der Ploeg and 118 Rezai, 2020; Cahen-Fourot et al., 2021; Semieniuk et al., 2021, 2022). Empirical evidence regarding 119 the macroeconomic effects of carbon pricing is somewhat mixed, with some studies finding no or 120 even small positive effects on GDP (Metcalf, 2019; Metcalf and Stock, 2023) and others predicting 121 negative impacts in the short run (Känzig, 2023). Model-based analyses often predict that aggressive 122 carbon pricing may reduce GDP and employment, but highlight that appropriate revenue recycling 123 can mitigate these outcomes (Brenner et al., 2007; Conefrey et al., 2013; Allan et al., 2014; Rivera 124 et al., 2016; Vermeulen et al., 2018; Allen et al., 2020; Wieners et al., 2024). Further, they suggest 125 that coordinating climate, monetary and prudential policy can help smooth transition risks, though 126 the desirable mix of such instruments strongly depends on how emission intensive sectors transform 127 (Annicchiarico et al., 2021; Diluiso et al., 2020; Lamperti et al., 2019, 2021). This calls for a more 128 fine-grained modelling of the energy sector, at the very least. Since the carbon price trajectories we 129 examine manifest in relatively sudden increases in the price of energy, our work also contributes to the 130 macroeconomic literature on energy price shocks (Wildauer et al., 2023; Turco et al., 2023; Bodenstein 131 et al., 2008; Auclert et al., 2023; Känzig, 2021). Finally, we contribute to the literature on MABMs 132 (Fagiolo and Roventini, 2017; Dawid and Delli Gatti, 2018) and in particular to two sub-strands. 133 The first regards the analysis of issues related to the green transition (e.g. Safarzyńska and van den 134 Bergh, 2017; Ponta et al., 2018; Hötte, 2020; Rengs et al., 2020) and energy price shocks (van der 135 Hoog and Deissenberg, 2011; Turco et al., 2023). The second sub-strand regards the assessment of the 136 macroeconomic consequences of changes in the distribution of income (e.g. Dosi et al., 2018; Caiani 137 et al., 2019; Terranova and Turco, 2022; Fierro et al., 2023). 138

Figure 1: Overview of the sectoral structure and inter-sectoral interactions depicted by DSK, the structure of the WITCH model, and the list of variables from WITCH scenarios used as exogenous inputs for DSK



## 139 **Results**

## 140 Macro-financial impacts of the transition

We analyze three climate transition scenarios. The "Current Policy" (CP) scenario incorporates policies implemented by 2020 and serves as a baseline. The other two scenarios are designed to limit temperature increases to specific values by imposing carbon budgets from 2020 onward. One features a carbon budget of 1000 GtCO2, leading to a 2°C temperature increase (2°C), and the other a carbon budget of 500 GtCO2, leading to a 1.5°C temperature increase (1.5°C). In both cases, carbon budgets are met by imposing a global carbon tax. Regarding the DSK policy setting, we initially assume that carbon tax revenues are entirely retained by the government and that the central bank adopts a

Figure 2: Energy price and transition dynamics. **a-c**, energy mix, defined as the share of total energy produced by each technology, for the three WITCH scenarios. **d-f**, energy price in (2005) dollars per kilowatt-hour in the three WITCH scenarios. X-axes always refer to years.



single-mandate Taylor rule, i.e. it adjusts the interest rate to stabilise inflation (section 1.1.6 in SI);
these assumptions will be relaxed in the policy experiments.

Figure 2 shows the energy mix and price dynamics for each transition scenario. Keeping temperature in line with the goals of the Paris Agreement purely through a carbon price leads to a temporary but sharp increase in energy prices. This is especially the case for the most stringent climate target of 1.5°C where fossil fuels are phased out rapidly during this decade (Figure 2 upper panel).

The energy price shock induced by climate policy leads to a series of macroeconomic adjustments and fluctuations that emerge from the properties of DSK. Figure 3 illustrates these adjustments by comparing scenarios. The main macroeconomic outcome is that of temporary stagflation (Figures 3a-3c) and low wage shares (Figure 3d). Unemployment and low economic growth emerge during this decade in the Paris-compliant scenarios;<sup>4</sup> the negative impacts on the real economy are accompanied by periods of high inflation.

Figure 4 delves into the mechanisms underlying the dynamics depicted in Figure 3. We find that a key role is played by the wage share, which significantly declines during the early phase of the transition when energy prices are high. Moreover, its dynamics closely mirror the unemployment rate (Figure 4a). By pooling all simulations across the three scenarios and calculating the quasi-elasticities of unemployment and the wage share with respect to the energy price, we find that high energy prices are associated with high unemployment and a low wage share (Figures 4c and 4d).

Largely unchanged aggregate markups (assumed in the DSK model) imply that carbon pricing and energy price shocks shift aggregate income from labour to the government (via carbon tax revenue) and the "green" energy sectors, while firms' income share remains unchanged. This also triggers a

<sup>&</sup>lt;sup>4</sup>Note that before 2020 in both the 1.5°C and 2C scenarios we observe a period of economic boom characterized by falling unemployment and high GDP. This occurs because, in WITCH, economic agents anticipate the future introduction of the carbon tax and begin investing in green energy technology. This investment stimulates economic activity before the carbon tax is implemented, resulting in a brief positive economic cycle.

Figure 3: Macroeconomic dynamics induced by different mitigation pathways. **a-c**, each line represents averages across 300 simulations, shaded areas are 95% confidence intervals, each colour is associated with a scenario; **c**, GDP loss relative to the CP scenario obtained using the ratio between real GDP in the 2C and 1.5°C scenarios relative to real GDP in the CP scenario; **d**, box-plot showing the distributions of wage shares in 300 simulations for of each scenario, period 2020-2030;



shift from labour income to dividend income, which is disproportionately saved rather than spent
(Kaldor, 1955; Bhaduri and Marglin, 1990; Dynan et al., 2004; Dutt, 2017). The final effect is a lack
of aggregate demand, leading to low employment and output.

As a result of cost pass-through,<sup>5</sup> an energy price surge induced by a rise in carbon prices is always inflationary on impact. In addition, nominal wage growth is pegged to the inflation rate (Equation 2 in SI). Higher inflation increases unit labour cost, which in turn feeds back into the general price level. However, wages also respond to labour market conditions, growing slower (faster) when unemployment is high (low). During a stagflationary period, inflation dynamics are hence dampened by weak labour market outcomes.

Figure 4b shows that inflation increases together with the energy price at first, but peaks while 178 the latter is still growing and subsequently decreases before the energy price begins its downward 179 trajectory driven by a rapidly growing share of renewables. Figure 5 shows the adjustments in the 180 energy sector, which exhibits a strong increase in credit demand (Figure 5a). This is driven by the 181 green sectors undertaking large investments (Figures 5b-5c) and by the fossil fuel sectors having to 182 pay the carbon tax and sustain costly spare capacity (Figures 5d-5e). The consequent erosion of 183 profitability affects financial stability, leading to an increase in defaults. Coal is especially affected, 184 with default rates in this sector rising to 10-20% for  $2^{\circ}$ C and  $1.5^{\circ}$ C targets respectively (Figure 5f). 185 Differently, oil and gas are only marginally impacted. This result confirms that rapid mitigation may 186 generate imbalances harming the financial stability of high emitting sectors (e.g. Mercure et al., 2018), 187 but these risks appear to be concentrated in specific areas (i.e. coal). 188

<sup>&</sup>lt;sup>5</sup>During the recent energy crisis due to the Russian invasion of Ukraine, firms have generally been able to fully pass energy price shocks (Lafrogne-Joussier et al., 2023) on to final output prices and possibly even increase their mark-ups in the process, giving rise to so-called *sellers' inflation* (e.g. Weber et al., 2024; Weber and Wasner, 2023). Our assumption of full pass-through with largely constant markups can therefore be seen as qualitatively in line with available empirical observations and possibly even somewhat conservative.

Figure 4: Macroeconomic and distributional effects along 1.5°C pathways. **a**, blue and red lines represent averages across 300 simulations of the 1.5°C scenario, the red line is the wage share (right), blue line is the unemployment rate (left); **b**, blue and red lines represent averages across 300 simulations of the 1.5°C scenario, red line is the energy price (right), blue line is the inflation rate (left); **c**, scatterplot of unemployment and logarithm of the energy price, results pooled across 300 simulations of each scenario, period from 2015 to 2050, red line is a non-linear interpolation; **d**, scatterplot of wage share and logarithm of the energy price, results pooled across 300 simulations of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation of each scenario, period from 2015 to 2050, red line is a non-linear interpolation.



Figure 5: Energy sector-finance link, asset stranding and energy sector imbalances in  $1.5^{\circ}$ C pathways. **a-f**, averages across 300 simulations; **a**, total credit demand of the energy sector across scenarios, expressed in 2022 US T\$<sup>6</sup>. Shaded areas represent 95% confidence intervals; **b**, energy sector credit demand disaggregated by sub-sectors,  $1.5^{\circ}$ C scenario, expressed in 2022 US T\$<sup>7</sup>; **c**, investment disaggregated by energy sub-sector,  $1.5^{\circ}$ C scenario, expressed as a share of total investment in the energy sector; **d**, energy sectors costs broken down by cost type and disaggregated by technology-groups. Costs are expressed in proportion to revenues and refer to the  $1.5^{\circ}$ C scenario for the time window 2020-2025; **e**, capacity utilization disaggregated by energy sub-sector, calculated as the ratio between actual production and the maximum potential production, the horizontal discontinuous line marks target capacity utilization, which is set to  $90\%^{8}$ ; **f**, defaults disaggregated by energy sub-sector expressed as the average ratio of defaulted debt to total debt across simulations, grouped by scenarios, period 2020-2040.



<sup>&</sup>lt;sup>7</sup>The model output is rescaled in order to obtain the credit demand figure in Trillion 2022 US\$. We calculate the energy sector-wide nominal credit-investment ratio produced by the model for 2022 in the CP scenario. We then multiply that ratio by the empirically observed nominal "power sector investment", as reported by the IEA *World Energy Investment 2023* (IEA, 2023), to infer the equivalent nominal credit demand expressed in Trillion 2022 US\$. Finally, we use this empirically inferred nominal credit demand for 2022 and its counterpart from the model to calculate a rescaling factor which is applied to the simulated time-series across all scenarios.

<sup>&</sup>lt;sup>8</sup>Note that occasionally capacity utilization can slightly exceed 1. This is because the energy mix is an input taken from WITCH scenarios and, during the transition, some energy sub-sectors in DSK may not yet have obtained the entire capacity needed to satisfy the demand implied by the exogenous energy mix. Since such inconsistencies are small, we allow the respective sectors to exceed full capacity utilization and accommodate the demand implied by the energy mix taken from WITCH.

#### <sup>189</sup> The role of monetary and fiscal policies

The simulations shown above point to disruptive business cycle fluctuations arising from the carbon pricing needed to stabilize global warming. So far, however, we did not consider potential monetary and fiscal policy responses. The central bank (CB hereafter) follows a single-mandate Taylor rule aimed purely at inflation stabilization (Section 1.1.6 in SI) and the government retains the entire carbon tax revenue.

To conduct a range of monetary and fiscal policy experiments, we relax these assumptions, allowing 195 the CB to respond to unemployment and the government to redistribute carbon tax revenues. As was 196 shown above, the dynamics generated by DSK in the 1.5°C and 2°C scenarios are qualitatively simi-197 lar. We therefore conducted our policy analysis for the most stringent climate scenario  $(1.5^{\circ}C)$ . The 198 alternative monetary policy rule modifies the single-mandate Taylor rule by adding an employment 199 stabilization component that is activated when the unemployment rate exceeds a threshold, leading 200 the central bank to lower its interest rate.<sup>9</sup> The central bank's reaction to unemployment is governed 201 by an exogenous parameter, measuring the strength of the central bank's reactivity to high unem-202 ployment: the larger the CB's reactivity to unemployment, the lower the interest rate in case of high 203 unemployment. The fiscal policy experiment involves the redistribution of the carbon tax revenue to 204 households. We assume that a share of current carbon tax revenue is distributed to households as a 205 lump sum transfer. Moreover, we assume that this transfer is treated as being equivalent to labour 206 income, and hence that the same propensity to consume applies to it. 207

Results from our policy experiments are summarised in Figure 6. First of all, they suggest an 208 important role for monetary-fiscal policy coordination to moderate the effects of the carbon tax. We 209 focus on the most period, i.e. 2020-2040, which we split into two decades, and focus on unemployment 210 and public debt-to-GDP ratios. In the first sub-period, fiscal policy is highly effective in reducing 211 unemployment (Figure 6a). This is because, during this period, the carbon tax is high, resulting in 212 large revenues to be redistributed. Monetary policy effects are instead negligible (Figure 6 in SI). This 213 is because, in 2020-2030, the policy rate does not change much across different CB reactivity levels to 214 unemployment (Figure 5 in SI). At the beginning of the transition phase, inflation rises faster than 215 unemployment and hence dominates the Taylor rule. In 2030-2040, carbon tax revenues decline as 216 emissions plummet, meaning that fiscal policy becomes less effective (Figure 7 in SI). However, we 217 observe a stronger role for monetary policy during this period (Figure 6b). In 2030-2040, inflation 218 recedes and so the employment stabilization effect dominates the Taylor rule, resulting in decreasing 219 interest rates.<sup>10</sup> 220

We also find that inflation is not responsive to monetary policy during the transition, meaning that lowering the policy rate to fight unemployment does not produce additional inflationary pressure (Figure 6 in SI). This is because inflation during the transition is driven by the energy price, which is exogenous to the policy rate. In the case of cost-push shocks, the main channel through which monetary policy could stabilize inflation is through expectation anchoring. However strong such a

<sup>&</sup>lt;sup>9</sup>Effectively, we assume a *recession avoidance preference* for the CB (cf. Cukierman and Muscatelli, 2008) with some degree of "recession tolerance", i.e. the policy rate response to unemployment is not asymmetrical around zero, but instead around a positive threshold level (cf. Bunzel and Enders, 2010). We set the threshold level at 10%, as this high unemployment rate can be considered an alarming indicator of a severe recession in most countries.

<sup>&</sup>lt;sup>10</sup>Central banks typically avoid abrupt changes in the policy rate; instead, they gradually adjust the policy rate towards a specific target. This behaviour is captured by the implemented Taylor rule (Equations 57 and 76 in SI). As a result, the policy rate responds with a certain lag after unemployment reaches its safeguard level and remains relatively low even after unemployment drops below this level (Figure 6 in SI). These two effects together determine the efficacy of monetary policy in the second phase of the transition.

Figure 6: Monetary and fiscal policy to stabilize the transition in 1.5°C pathways. **a-b** and **d-e**, dots refer to averages across 50 simulations, with each dot representing a policy experiment, red dots refer to the baseline configuration, bars are 95% confidence intervals; **a**, average unemployment rate, 2020-2030, 1.5°C scenario, across fiscal policy experiments, i.e. different shares of redistributed carbon tax revenues; **b**, average unemployment rate, 2030-2040, 1.5°C scenario, across monetary policy experiments, i.e. different degrees of CB reactivity to unemployment; **d**, average public debt-to-GDP ratio, 2020-2030, 1.5°C scenario, across monetary policy experiments, normalized at 2015 value; **c**, average unemployment rate, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments; **f**, average public debt-to-GDP ratio, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments, normalized at 2015 value; **f**, average public debt-to-GDP ratio, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments, normalized at 2015 value; **f**, average public debt-to-GDP ratio, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments, normalized at 2015 value; **f**, average public debt-to-GDP ratio, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments, normalized at 2015 value; **f**, average public debt-to-GDP ratio, 2020-2040, 1.5°C scenario, across monetary and fiscal policy experiments, normalized at 2015 value.



channel might be in the real world, it is absent from our model, meaning that we may underestimate the inflationary costs of an expansionary monetary policy along the transition.

The complementarity between fiscal and monetary policy hence stems from the fact that they are 228 effective at limiting unemployment during different phases of the transition. Figure 6c illustrates their 229 complementarity by pooling simulation data across phases. It shows that the average unemployment 230 rate for the full 2020-2040 period is lowest when fiscal policy redistributes a high share of carbon tax 231 revenue and monetary policy is expansionary. In addition, monetary-fiscal policy coordination also 232 has relevant effects on the public budget (Figures 6d, 6e, 6f). In particular, a lower policy rate will 233 tend to lower the cost of servicing public debt in the latter phase of the simulation, hence creating 234 fiscal space. Additionally, we observe that carbon tax revenue redistribution has a largely neutral 235 effect on public debt. When carbon revenue is not redistributed, this represents an additional source 236 of general revenue for the government. At the same time, however, declines in GDP and employment 237 imply that other tax revenues will tend to decline, while outlays for unemployment benefits increase. 238

#### 239 Discussion

Mitigation pathways, such as those reviewed in IPCC reports (IPCC, 2022), offer a detailed assessment 240 of decarbonisation dynamics that all key sectors should undergo to meet certain climate targets. 241 However, in their current status, they fail to provide an informative picture of the imbalances that 242 such a process can create at the macro-financial level. Further, they are silent on the behaviour of 243 macroeconomic aggregates at the time scale (e.g. quarterly or annual frequency) that is relevant for 244 designing stabilisation policies accompanying climate ones. This study combined the strengths of two 245 complementary modelling approaches, IAM and MABM, to shed light on the macroeconomic and 246 financial implications of mitigation scenarios. Process-based IAMs generate transition pathways with 247 high technological detail, while the strength of MABMs lies in the joint depiction of short and long-run 248 out-of-equilibrium economic dynamics, distributional feedback effects, and real-financial interactions. 249 This, combined with MABMs' capacity to handle a wide range of relevant economic variables, renders 250 the IAM-MABM link a valuable instrument for refining the estimation of transition costs across various 251 dimensions and transmission channels. 252

By simulating detailed transition scenarios generated by the WITCH IAM in the DSK MABM, 253 we showed that ambitious mitigation trajectories guided by carbon pricing - as the vast majority of 254 pathways in the literature - induce perils to macro-financial stability. Indeed, we showed that scenarios 255 compatible with 2° and 1.5°C tend to generate high unemployment and high inflation, resembling 256 dynamics typical of so-called "stag-flationary" episodes. The source of the instability lies in the rapid 257 transformation of the energy sector and its connection to the financial system. Our results point to 258 the emergence of costly physical stranded assets in the fossil fuel-intensive sectors (see also Mercure 259 et al., 2018; Semieniuk et al., 2022), which contribute to an erosion of profitability of these sub-sectors 260 during the transition. These decreases in profitability, in turn, result in an increased need for external 261 finance as well as a higher rate of defaults. However, such risks concentrate in the coal sector, while 262 gas and oil face much lower exposure. 263

Further, we showed that that an orderly (low unemployment) and just (low labour share losses) 264 are not independent: they need to align. Indeed, the price of energy can be viewed as a distributional 265 variable and shifts in functional income distribution resulting from climate policy can have undesired 266 macroeconomic consequences. In particular, our results suggest that unless corrective policy action 267 is taken, transition pathways guided by carbon prices are associated with temporary periods of high 268 inflation and high unemployment. This volatility has detrimental consequences for the feasibility of 269 decarbonization. These results point to the need (i) to account for ampler policy packages within 270 mitigation pathways (e.g. Wieners et al., 2024), (ii) to report climate policy strength beyond carbon 271 pricing. 272

Conducting a battery of fiscal and monetary policy experiments, we showed that redistribution of carbon tax revenue can play an important role in limiting the negative macroeconomic effects of carbon pricing during the early phase of the transition. Expansionary monetary policy, on the other hand, was found to be more effective during the later stages of the transition, suggesting a positive role for monetary-fiscal policy coordination.

Overall, our study emphasizes the importance of incorporating a macro-financial dimension into the analysis of mitigation pathways. This addition is essential for a more comprehensive assessment of the viability of decarbonization trajectories and the effectiveness of underlying climate policies. We demonstrate that integrating macroeconomic models with integrated assessment models is a promising approach, although several limitations must be addressed in future research. Specifically, adopting
a more disaggregated perspective at the country or macro-regional level is essential to offer clearer
insights into practical policymaking.

#### **285** Online Methods

This study integrates an agent-based macroeconomic model and a process-based integrated assessment model to assess the materiality of transition risks along ambitious (deep) mitigation pathways. Detailed descriptions of the two models can be found in Reissl et al. (2024) (DSK) and Emmerling et al. (2016) (WITCH). Additionally, a thorough discussion of key model features, including necessary extensions to the DSK framework for coupling with WITCH, is provided in Section 1 of the SI. In this section, we outline the main model features relevant to our analysis.

The economic core of the DSK model is formed by two vertically integrated agent-based firm sectors, namely consumption good firms and capital good firms (C-Firms and K-Firms hereafter). K-Firms produce machines characterised by heterogeneous labour productivities, energy efficiencies and emission intensities. To produce them, K-Firms use production techniques which are also heterogeneous in terms of labour productivity, energy efficiency and emission intensity. New capital goods and production techniques are the product of K-Firms' R&D, which determines long-term growth.

C-Firms use machines, labour, and energy to produce a homogeneous consumption good. C-Firms 298 buy machines to match expected demand. Firms' activities are financed through retained earnings 299 and, in the case of C-Firms, loans from a banking sector. Households consume and receive income 300 in the form of wages for supplied labour, interest on deposits, dividends from firms, banks and the 301 energy sector, as well as unemployment benefits and occasional government transfers (like redistributed 302 carbon tax revenues). The government collects taxes and spends on unemployment benefits, transfers, 303 and the bailout of failing banks, while the central bank sets the policy rate. The DSK model also 304 includes an energy sector which supplies the firm sector with the energy needed for production, invests 305 in physical capital and finances its activities using internal funds and bank credit. 306

The consumption and capital goods sectors, as well as the banking sector, consist of multiple and heterogeneous agents. We leverage the MABM framework to agentify the WITCH energy sector into eight macro-agents, each representing a distinct energy technology. Households are modelled as an aggregate entity. Table 2 in SI shows the transaction flow matrix of the model, summarising the transactions between sectors and how these are financed.

The balance sheet and transaction flow matrices (Section 1, Tables 1-2 in SI) can be used to derive the accounting identities that must be satisfied for the model to be formally stock-flow consistent. To ensure stock-flow consistency during simulations of the model, all transaction flows and balance sheet items are explicitly tracked. At the end of each simulation period, the model performs a series of checks at the agent, sectoral and aggregate levels to ensure that no accounting identities have been violated during the period.

The WITCH (World Induced Technical Change Hybrid) model is an integrated modelling framework that captures the interactions among climate change, energy systems, and economic growth. It combines a macroeconomic model with a detailed energy system. The macroeconomic (top-down) aspect uses an intertemporal optimization strategy that incorporates macroeconomic relationships and dynamics over time. Simultaneously, the energy system (bottom-up) component details the technology options available in the energy sector. This dual approach facilitates the cost-effective optimization of strategies to minimize global costs associated with achieving specific climate and energy targets, taking into account investment, operational costs, the repercussions of climate change, and policy instruments such as carbon pricing.

The model divides the world into distinct global regions and generates optimal mitigation pathways up to 2100. These pathways are obtained through a welfare maximization process that accounts for regional interactions and the strategic dynamics spawned by global externalities, employing an iterative method to achieve a non-cooperative Nash equilibrium.

WITCH is distinguished by its dynamic representation of R&D diffusion and innovation in energy efficiency and low-carbon technologies. It encapsulates the broad spectrum of externalities in climate and innovation policy, including the global sharing of knowledge and technology spillovers, which influence each country's adoption of low-carbon technologies and energy productivity. This is based on regional energy research and development, capital stocks, and the global cumulative installed technology capacity.

From an economic point of view, the model simulates a single-sector economy, where output may be influenced by climate impacts (climate change impacts are not activated in this study), and costs related to fossil fuel use and greenhouse gas mitigation are accounted for. It employs a social planner perspective to optimize regional utility, including risk aversion to future consumption levels. A CES function represents the production of goods using capital, labour, and energy services.

The energy sector within the WITCH model covers a broad spectrum of primary energy sources, conversion technologies, and consumption sectors. It includes diverse energy carriers, from fossil fuels to renewables, and technologies, from power generation to transportation, representing technological advancements and energy efficiency gains over time.

The scenarios generated for this study follow standard policy designs. The Current Policy scenario 346 implements current national climate policies and extrapolates the same effort level across the century 347 using regional carbon prices. Regulations and emission constraints are maintained throughout the 348 century. The climate policies '2C' and '1.5°C' aim for global net-zero emissions, following the design 349 presented in Rogelj et al. (2019). Starting from 2020, a global carbon tax is implemented to reduce 350 CO2 emissions. Once CO2 emissions reach net zero, global emissions are maintained at this level 351 until the end of the time horizon. Until the net-zero year, the carbon price is set to limit cumulative 352 emissions to 1000 GtCO2 for the '2C' scenario and 500 GtCO2 for the '1.5°C' scenario. Thereafter, 353 the carbon price is adjusted to equal the emission market price to stabilize emissions at zero globally. 354 More details about these two scenarios can be found in Drouet et al. (2021) and Riahi et al. (2021). 355

To couple the two models, we establish a one-way link from WITCH to DSK. Specifically, tech-356 nology and cost-related variables for the energy sector, along with energy and carbon prices from 357 transition scenarios generated by WITCH, are fed into DSK (see Figure 1). We chose these variables 358 to partially replace the DSK energy sector with that of WITCH. The resulting energy-level variables 359 — such as production, investment, and credit demand — emerge from the interaction between the 360 two models. This interaction combines the microeconomic variables from WITCH (e.g., operation 361 and maintenance costs, energy mix) with the macroeconomic variables from DSK (e.g., aggregated 362 energy demand, financial conditions). Table 1 illustrates how the variables from WITCH and DSK 363 are combined, along with the resulting outputs. For more detailed information, please refer to the SI. 364 WITCH produces scenarios up to 2100. For the current exercise, we only examine their effect on 365 DSK dynamics up to 2050, which is the phase during which the transition takes place in decarboniza-366 tion scenarios. Since DSK is a single-region model, global-level variables from WITCH are used as 367

#### WITCH-DSK coupling

Coupling output	WITCH	DSK	Coupling output
Coupled energy price	Energy price	Inflation	
Energy production	Energy mix	Aggregate	
		energy demand	
Energy expenditures		Aggregate	Coupled energy price
		energy demand	
Coupled carbon tax	Carbon tax	Inflation	
Capacity expansion		Target capacity	Energy production
Capacity expansion		utilisation	
Capacity	Capital depreciation		Capacity expansion
	Unit costs of		
Nominal investment	investment		Capacity expansion
	Capacity factor		
Fixed costs	Maintenance costs		Capacity
Operating costs	Production costs		Energy production
Emissions	Emission intensities		Energy production
Carbon tax normanta			Emissions
Carbon tax payments			Coupled carbon tax
			Operating costs
Credit domend		Loan refinancing	Fixed costs
Oreun demand		Deposits	Nominal investment
			Carbon tax payments

Table 1: The first column lists the variables that result from combining WITCH inputs with endogenously produced variables from DSK. The second and third columns indicate which variables from WITCH and DSK are used to produce a particular coupling output variable. The last column indicates that some coupling outputs are recombined with WITCH and/or DSK variables to produce additional coupling outputs.

inputs.Section 1.4 in the SI discusses the calibration and the empirical validation of the modelling framework used in this work.

Macroeconomic policies and climate policies run together in the coupled model. Climate policy is implemented into WITCH, while fiscal and monetary policies are set in DSK. Section 1 of the SI provides additional insights into the policy rules adopted. Section 2 in the SI discusses the transmission of the climate policy shocks at the macroeconomic level (see Section 2.1) and provides additional results on the stabilizing effects of monetary and fiscal interventions (see Sections 2.2 and 2.3, respectively).

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