Comparison and interactions between the long-term pursuit of energy independence and climate policies

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Abstract

Ensuring energy security and mitigating climate change are key energy policy priorities. The recent IPCC Working Group III report emphasized that climate policies can deliver energy security as a co-benefit, in large part through reducing energy imports. Here, using five state-of-the-art global energy-economy models and eight long-term scenarios, we show that while deep cuts in greenhouse-gas emissions would indeed reduce energy imports, the reverse is not true: ambitious policies constraining energy imports would have only an insignificant impact on climate change. Restricting imports of all fuels would lower 21st century emissions by only 2%-15% against the Baseline scenario as compared to a 70% reduction in the 450 scenario. Restricting only oil imports would have virtually no impact on emissions. The modeled energy independence targets could be achieved at policy costs comparable to those of existing climate pledges but a fraction of the cost of limiting global warming to 2°C.

With increasing tensions between Russia and the West, the escalation of several crises in the Middle East, and the volatility of the oil market, energy security is on the top of the political agenda¹⁻³. At the same time, world leaders have agreed to limit the

increase in global mean temperature to below 2°C (ref. ⁴) and there is a multitude of efforts to curb greenhouse gas (GHG) emissions⁵.

Climate change mitigation policies are frequently considered to lead to significant energy security co-benefits, such as reduction in energy imports, slower depletion of non-renewable resources, and increasingly diverse energy sources⁶⁻¹². Previous research has also explored the benefits of achieving climate and non-climate energy objectives simultaneously¹³⁻¹⁵. But some of these non-climate objectives, such as reducing energy imports, can be pursued in their own right and achieved either by climate-friendly measures such as constraining energy demand and expanding domestic renewables or by high-carbon alternatives such as increasing domestic coal use.

In this study, we reverse the usual question and examine the effects of energy independence policies on GHG emissions. We conduct a multi-model comparison of these two policy objectives, using five leading global energy-economy models (IMAGE, MESSAGE, REMIND, WITCH and TIAM-ECN). We provide quantitative analysis of the interaction between strategies to reduce energy imports (both for oil and for all fuels together) and climate change mitigation. We address three questions related to this interaction. First, how would energy independence policies change energy systems as compared to climate policies? Second, what would be the impact of energy independence policies on GHG emissions? Finally, what would energy independence policies cost, especially in comparison with climate policies? We find that while climate stabilization policies would result in lower energy trade, energy independence policies would only decrease cumulative 21st century GHG emissions by 2-15% compared to a Baseline scenario. In this case, the global median temperature would be 3.5°C-4°C above the pre-industrial level for 2100, far exceeding the 2°C target agreed upon by the international community. Oil import restrictions would have virtually no impact on emissions or global temperature increase. We also show that energy import constraints would lead to decreasing fossil fuel and overall energy use, but not necessarily to universal expansion of renewables. Finally, the policy costs of the modeled energy independence targets would be a fraction of those of climate change stabilization.

The concept of energy security

Energy security is a complex policy problem that can encompass everything from securing oil supplies to reducing the risks of blackouts and protecting critical infrastructure¹⁶⁻¹⁹. Historically, the focus of much of the energy security literature has been security of supply and energy dependence^{20,21} but recently the concept has expanded to also include security of energy-related infrastructure and resilience of energy systems^{18,19,22}. In this paper we follow a general definition of energy security as 'low vulnerability of vital energy systems'¹⁶ which served as the basis for energy security assessment frameworks used in the Global Energy Assessment²³, the IEA

Model of Short-term energy security²⁴ and in evaluating energy security in long-term global scenario studies^{7,8,10}. We delineate vital energy systems as primary energy supplies or specifically oil supplies for major economies.

The vulnerability of vital energy systems can be analyzed from three distinct perspectives: robustness, resilience and sovereignty¹⁷. The robustness perspective (minimizing exposure to predictable threats such as resource scarcity²⁵) and the resilience perspective (increasing the ability of vital energy systems to respond to disruptions^{22,26,27}) have also been assessed in long-term scenarios^{8,9}, but modeling corresponding policies has not yet been done and should be part of future research. We focus our analysis on the sovereignty perspective where the main vulnerabilities come from energy systems being controlled by foreign actors. This perspective prescribes energy independence as the main energy security strategy.

Pursuing energy independence has consistently been observed across a range of historic periods, configurations of energy systems, levels of economic development and political arrangements²⁸ and continues to shape current policy discourses^{2,3,29-32}. For example, in the 2012 U.S. presidential race, President Obama pledged to cut oil imports by 1/3 by 2025²⁹ and the Republican candidate pledged to achieve energy independence by 2020³⁰. In 2010, Japan's Basic Energy Plan aimed to double its energy "self-sufficiency ratio" by 2030^{33,34} and more recently, India's Power and Coal Minister vowed to stop importing coal by 2019³¹. The level of energy imports has been one of the most widely used indicators of energy security in the context of long-term scenarios^{9,12}.

Modeling energy independence and climate policies

We model achieving energy independence objectives in all world regions, both limited to oil and extending to the overall primary energy supply. Over the last several decades, oil has been the main energy security concern due to its geographically concentrated production, perceived and real scarcity, and lack of substitutes, particularly in the transport, agriculture and defense sectors^{23,32,35}. However, oil has not always dominated the energy security agenda, and may not in the future. For instance, in the 1950s and 1960s the U.S. and many Western European countries switched a number of power plants from coal to oil to avoid coal's "high prices and irregularities in supplies"³⁶. In the European Union, the energy security strategy focuses on reducing and diversifying natural gas imports². Many long-term scenarios indicate that future gas trade could significantly increase, and coal could become the most traded fuel by mid-century^{8,10}.

We compare energy system changes from pursuing energy independence to reduce either energy or oil imports to two different climate policy scenarios from the literature: (1) projecting an ambitious interpretation of the Copenhagen climate pledges through 2100^{6,37,38} and consistent with the Intended Nationally Determined

Contributions (INDCs) through 2030 (Supplementary Figure 1 and Supplementary Table 1); and (2) ensuring climate stabilization with universal action beginning after 2020 and stabilizing GHG concentration at 450 ppm CO₂-equivalent (CO₂e) by 2100³⁸. We also include a 500 ppm CO₂e scenario³⁸ to explore a more modest climate change stabilization target (Table 1). Additional scenario runs were used to test the robustness of the results.

Table 1 Overview of scenarios

Scenario	Description
Baseline	A counterfactual development without climate policies or restrictions on energy imports ^{38,42} . (Supplementary Figure 3)
Energy independence	Restrictions on overall energy imports. Targets based on observed policies and trends (Table 2) are set for 2030 with the net-import level maintained throughout the rest of the century. In rare instances when a model could not achieve the target for a particular region, it was systematically relaxed until a solution was found (see also Methods, Supplementary Table 2 and Supplementary Tables 4-8).
Oil independence	All oil-importing regions cut their net import dependence in half by 2030 and maintain that level throughout the century. In rare instances when a model could not achieve the target for a particular region, it was systematically relaxed until a solution was found (see also Methods and Supplementary Table 3 and Supplementary Tables 4-8).
Pledges	An ambitious interpretation of the Copenhagen climate pledges are met by 2020 and emission-reduction levels are extrapolated through 2100 (see also Methods and Supplementary Table 1) ^{37,38}
Climate stabilization - 500	Climate policies beginning after 2020 to achieve GHG stabilization at 500 ppm _e by 2100. (See Supplementary Figures 5-7)
Climate stabilization - 450	Climate policies beginning after 2020 to achieve GHG stabilization at 450 $\mbox{ppm}_{\mbox{\tiny e}}$ by 2100.

Energy dependence is calculated as the net imports of all traded fuels divided by the total primary energy supply in a given region and year (Equation 1). For each region, we model energy independence targets which are at least as ambitious as empirically observed policies and trends: import dependent developed regions with low energy demand growth cut their energy imports in half by 2030 while rapidly growing emerging economies maintain their current relatively low level of imports for the rest of the century (Table 2, Supplementary Table 2). Energy exporters, including North America after 2030, do not become importers. These restrictions are imposed on all fuels and carriers represented in models to ensure that overall energy imports including trade in 'new fuels' such as bioenergy remains within the established limits (Table 3).

Table 2 Regional import reduction targets for the Energy independence scenario

Region-type	Includes	Target
Energy importing developed regions with low energy demand growth	Europe and OECD regions other than North America	Cut their 2010 net import dependence in half by 2030 and maintain that relative level through the 21st century.
2. Energy importing emerging economies with high energy demand growth	China, India and other non- OECD Asian economies	Maintain their current level of net- energy imports throughout the century
3. Energy exporters	Middle East, Former Soviet Union, Africa, Latin America, and other regions which are net-exporters	Never become energy importers
4. The U.S./North American region	U.S. and North America	Becomes energy independent by 2030 and maintains energy independence, consistent with political debates ^{29,30} and recent modeling results ^{8,63-65} .

See Supplementary Note 1 and Supplementary Table 9 for regional definitions and Supplementary Tables 2-8 for quantitative regional targets.

Oil independence is calculated as net oil imports divided by the total oil supply (Equation 2). In the oil independence scenario, we model a world where all importing regions cut their oil import dependence in half by 2030, except the US/North American region which goes further and becomes oil independent by 2030. This reflects the fact that major emerging economies already have high oil import dependence (Supplementary Table 3).

Table 3 Energy products which are traded in each model

Model	Energy products which are traded
IMAGE	crude oil, natural gas, coal, biomass, biofuels, hydrogen
MESSAGE	crude oil, natural gas, coal, oil products, electricity, biofuels, hydrogen, liquefied coal and natural gas
REMIND	crude oil, natural gas, coal, biomass
TIAM-ECN	crude oil, natural gas, coal, biomass, oil products
WITCH	crude oil, natural gas, coal

Effect of energy independence policies on energy systems

We find that pursuing energy independence leads to lower energy intensity (measured as primary energy use over Gross Domestic Product, GDP) resulting in lower energy demand and consequently in lower oil and gas use over the short-term (through mid-century) and a drop in coal use over the long-term (Figure 1, Figure 2). This contrasts with the strong growth in coal trade to up to four times today's oil

trade volumes in the Baseline scenario^{8,10}. Primary energy supply also drops to significantly lower levels in the Pledges and Climate stabilization scenarios. In the Energy independence scenario, an increase in renewable energy use varies from one model to another, though in no model does it reach the level observed under the 450 scenario (Figure 1, Supplementary Figure 4).

2050 2100 a Coal Scenario 750 Baseline Energy independence 500 Oil independence Pledges 250 500 0 450 **b** Oil and gas Primary energy (EJ/year) Model 750 IMAGE MESSAGE REMIND 250 TIAM-ECN WITCH **C** Renewables 750 500 250

Figure 1 Primary energy development under energy independence and climate policy scenarios

The development of (a) coal, (b) oil and gas and (c) renewables in the Baseline, energy independence and climate policy scenarios. Colours represent each scenario, while symbols distinguish the different models studied.

Scenario

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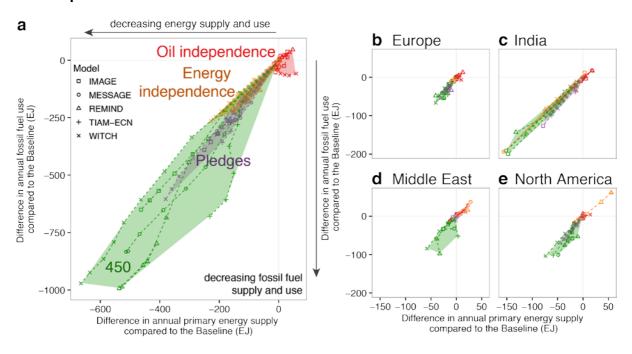
The Energy independence scenario portrays three distinct regional trends for major 21st century importers, industrialized economies, and energy exporters (Figure 2, Supplementary Figures 5 and 6). These groups are typified in Figure 2 by India, Europe, and North America and the Middle East respectively. The major importers (Africa, India, China, and the rest of Asia) experience a large reduction in energy intensity and fossil fuels supply which curtail the growth of energy imports expected

under the rapidly growing demand in the Baseline. The reduction in fossil energy use and increase in renewables in some of these regions in the Energy independence scenario is comparable to the Pledges scenario and in certain models even to the climate stabilization scenarios. This is because there is no other way to meet rapidly rising demand given scarce domestic fossils.

Industrialized importers (Europe and Pacific OECD) experience a relatively modest reduction in the use of fossil fuels and decrease in energy demand under the Energy independence scenario. This is due to lower energy demand growth in the Baseline and thus less change is required to meet the independence targets. Regionally, the difference between the Climate stabilization and Energy independence scenarios is most pronounced for the 21st century energy exporters (Middle East, the former Soviet Union and North America) where there might actually be a slight increase in fossil fuel use under the Energy independence scenario as the global demand for oil, gas and coal drops. As a result, energy independence policies in importing countries may make it somewhat less attractive for energy exporters to decarbonize.

The oil independence scenario shows less oil use, primarily in the transport sector but the energy demand and the overall fossil fuel use are almost the same as in the Baseline since gas and coal substitute oil (Figure 2, Supplementary Figures 5 and 6). Regionally, oil independence policies primarily affect energy systems in oil importing regions, however the Middle East experiences a small increase in domestic oil use as the global demand contracts Figure 2).

Figure 2 Main energy system changes from energy independence compared to climate policies scenarios



Panel a shows the changes at the global level while panels b-e show representative regions: (b) industrialized economies (Europe); (c) emerging energy-importing economies (India); and (d) traditional and (e) emerging exporters (Middle East and North America, respectively). See Supplementary Note 1 and Supplementary Table 9 for regional definitions. All changes are calculated compared to the Baseline energy mix (shown in Supplementary Figure 3). In panel **a**, each model's results are depicted for each decadal year between 2010 and 2100. In panels **b-e**, each model's results are depicted for the years 2030, 2050 and 2100. Colors represent each scenario, while symbols distinguish the different models studied.

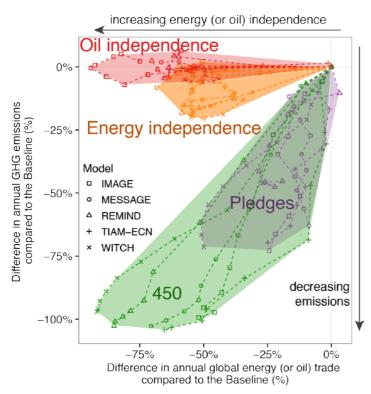
Mutual impact of energy independence and climate policies

The modest changes in fossil energy use in the Energy independence scenarios lead to a small decrease in cumulative GHG emissions: 2-15% lower than in the Baseline compared to over 70% reduction in the Climate stabilization scenarios and a 30-45% decrease under the Pledges (Figure 3). These trends correspond to roughly 3.5°C-4°C temperature increase above pre-industrial levels in the energy independence scenarios, 2.5°-3.2°C in the Pledges scenario and to no more than 2°C for the climate stabilization scenario (see Methods for details on warming estimates). Oil independence policies have almost no impact on GHG emissions (Figure 3, Supplementary Figures 2 and 7).

On the other hand and consistent with other studies^{7,8,10,39}, we find that climate stabilization policies reduce energy trade and energy imports by up to 75% by 2050 (Figure 3, Supplementary Figure 1). In fact, over the long-term climate stabilization policies lead to *lower* energy imports than in the Energy independence scenario due to a phase out of tradable fossil fuels. Over the next couple of decades, however, the modeled Energy independence policies result in lower energy imports because the 450 scenario limits the use of domestic coal. These results are different at the regional level, particularly depending on whether a region is an energy importer or exporter (Supplementary Figure 8).

In the Pledges scenario, there is some decrease in global energy trade compared to the Baseline; however, this decrease is much smaller than in the Energy independence scenario and would not be sufficient to curtail growing energy imports in rapidly growing regions. This is consistent with earlier findings⁸ showing that under the Pledges scenario imports would decline in some regions (e.g. the EU) but would continue to grow in China and India.

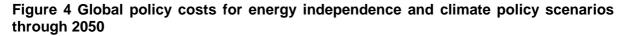
Figure 3 Emission and energy trade impacts of energy independence and climate policy scenarios

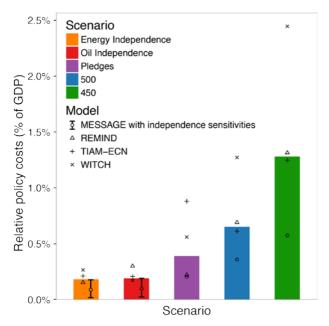


For the Energy independence, 450 and Pledges scenarios, the decrease is relative to total energy trade whereas for the Oil independence scenario, the difference is relative to global oil trade. Each line represents a model's results for each decadal year between 2010 and 2100. GHG emissions represent Kyoto gases except in TIAM-ECN where they represent CO_2 , CH_4 and N_2O . Colors represent each scenario, while symbols distinguish the different models studied.

Policy costs of energy independence versus climate goals

We calculate policy costs as a proxy for the relative difficulty of implementing the modeled targets using a cost-effective strategy (see Methods). While there is considerable uncertainty surrounding the policy costs of climate policies^{6,40-43}, we find that the relationship between the policy costs of independence targets and climate policies is robust between models. The policy costs of the Energy and Oil independence scenarios to 2050 are between 0.1-0.3% of global GDP, which is comparable to those of the Pledges scenario (0.1-0.8% of global GDP) but only between one-fifth and one-tenth of the cost of the 450 scenario (0.4-2.4% of global GDP) and between one-half and one-fifth the cost of a 500 scenario (0.4-1.2%) (Figure 4). By 2100, the global policy costs of the Energy independence scenario in all models are one-tenth of the costs of the 450 scenario and one-fifth to one-seventh of the cost of the 500 scenario (Supplementary Figure 9). Uncertainties in these costs both between models and with respect to specific assumptions are shown in Figure 4 (see also 'Uncertainties and sensitivities' below).

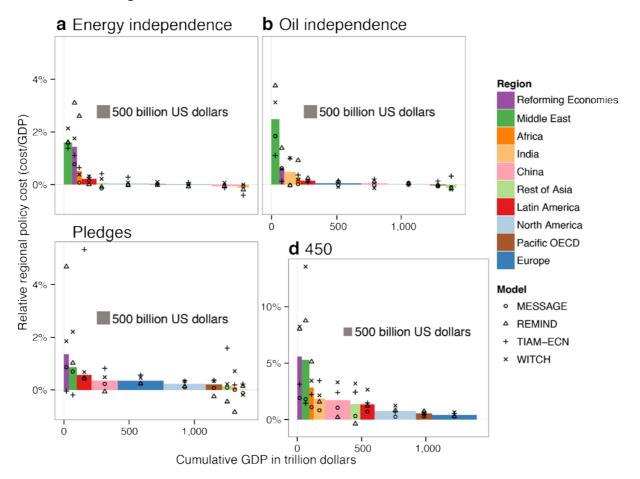




See Methods for calculation of policy costs. Bars show medians, markers show individual models. Costs are expressed in relative differences of Net Present Value from 2010 to 2050 using a 5% discount rate compared with the Baseline scenario. In MESSAGE the full range of sensitivity cases for the independence scenarios is shown (see also Supplementary Tables 12 and 16). Colors represent each scenario, while symbols distinguish the different models studied.

The policy costs of energy independence are predominantly borne by energy exporters (Middle East, Africa, and the former Soviet Union) because they include lost export revenues due to other regions limiting fossil fuel imports, for either the sake of energy independence or climate policies. For example, the Middle East bears between a quarter and three quarters of the global policy costs in the energy independence scenarios. The costs of climate change mitigation are more evenly distributed across regions for example, the Middle East's cost burden is less than a third of the global policy costs in the 450 scenario (Figure 5 and Supplementary Table 10).

Figure 5 Regional policy costs for energy independence compared to climate policy scenarios through 2050



(a) Energy independence, (b) Oil independence, (c) Pledges and (d) 450 scenarios. Note the 450 panel is on a different scale since the costs of climate stabilization are several times more than the costs of the other three scenarios. The height of the bars shows median policy costs as % of the relevant regional GDP and the area of the bars shows total median policy costs of each region. Markers show the range of policy costs as % of GDP for individual models. Costs are expressed in Net Present Value from 2010 to 2050 using a 5% discount rate. See Supplementary Note 1 and Supplementary Table 9 for regional definitions. Colors represent regions, while symbols distinguish the different models studied.

Uncertainties and sensitivities

We have tested the sensitivity of our findings against three types of uncertainties: (a) model uncertainty, (b) parametric uncertainty, and (c) import policy uncertainty. We address the model uncertainty by including results from five models with different representations of energy-economy systems (e.g. how investment decisions are made and how energy demand and supply respond to policy constraints — Supplementary Note 2). We probed the parametric uncertainty by modeling import restrictions in the MESSAGE model under three baseline scenarios spanning a wide range of uncertainties. These scenarios are based on three distinct shared socio-economic

pathways (SSPs), designed by the climate change research community to explore how socio-economic, technological, demand and resource uncertainties might impact climate change mitigation and adaptation challenges⁴⁴⁻⁴⁶. We use the three SSPs which represent the widest range of challenges for climate change mitigation: from the 'Sustainability World' where the cost of new technologies rapidly fall and fossil resource availability is constrained, to a fossil-rich world with slow uptake of new technologies and large fossil resource availability (Supplementary Note 3). Finally, we also used the MESSAGE model to test the sensitivity of our results against the import policy uncertainty by varying the level of energy import restrictions to 50% higher and lower than the targets used in our Independence scenarios (Supplementary Note 4).

The sensitivity analysis shows that our main findings that energy import restrictions would result in smaller emission reductions, more modest energy systems changes and require a fraction of the effort of climate change mitigation is robust across five models and radically different Baselines. Consistent with diagnostic indicators for our models from Kriegler et al.⁴⁷, we find that models with more flexible energy demand and 'stiffer' supply (e.g. WITCH) show a stronger demand response and weaker structural response (i.e. shift to renewables) to energy import constraints than other models (e.g. REMIND) (Figure 1 and Supplementary Figure 6). In a fossilrich world with slow uptake of new technologies, restricting energy imports would require more extensive energy system changes and lead to more emission reductions (Supplementary Figure 10). However, the relative scale of changes compared to the Baseline and 450 scenarios would be similar to our findings (because emissions in the Baseline would be higher and climate stabilization would also require larger emission reductions). We also find that even under much stricter import constraints, with all regions importing less than 20% of their energy needs, the energy and emission changes as well as the costs are still significantly smaller than those required for climate stabilization (Supplementary Figure 11 and Supplementary Tables 15 and 16).

While the sensitivity analysis demonstrates the overall robustness of our results, it also points to several key caveats. First of all, although our findings are valid under a wide range of baseline assumptions, one could in principle imagine baselines where these findings may be less pronounced. In particular, technological limitations (e.g. on unconventional fossils) could make achieving climate stabilization less effortful and achieving energy independence more difficult so that the differences between the effects of the two objectives would be less. We show that the cost difference between climate stabilization and energy independence policies declines in a 'Sustainability World' (Supplementary Table 12). Under even more limited fossils and even faster uptake of renewables the costs of climate stabilization and energy independence may both drop and further converge, especially for a more modest stabilization target. In addition, our exploration of model uncertainties shows that in case of more flexible energy demand and renewable penetration, import restrictions result in larger

emission reductions. Once again, it is possible to imagine a model with such high responsiveness of demand and share of renewables that import restrictions would lead to even higher emission reductions less different from those needed for climate stabilization.

Conclusions

Our analysis dispels two assumptions often present in energy and climate policy discourses. First, we find that the cost-effective pursuit of ambitious energy independence targets is not likely to result in significant reduction of GHG emissions nor would it universally increase renewable energy use and be sufficient for achieving even the climate Pledges. In other words, climate will not be saved as a 'side-effect' of energy independence efforts. Secondly, our findings question the main (although not always explicit) assumption behind the efforts to quantify 'co-benefits' of climate policies. The assumption is that the knowledge of such co-benefits would automatically increase support for climate measures from advocates of non-climate energy policy objectives. We show that at least in case of decreasing energy imports this argument should be more nuanced: though stringent climate policies may indeed bring a considerable reduction in energy imports, a similar reduction can also be achieved at a fraction of the climate change mitigation cost if energy independence is pursued as a separate objective in its own right. This means that cost-sensitive political advocates of energy independence may have little reason to support climate stabilization policies. In other words, whether the presence of energy security or other 'co-benefits' is likely to significantly increase political support for climate policies should be subject to special analysis which takes into account both the relative costs of achieving various energy objectives and cost-sensitivity of political preferences for these objectives.

Methods

Study design

This study is based on modeling long-term global energy scenarios using five integrated assessment models (IAMs): IMAGE^{48,49}, MESSAGE^{50,51}, REMIND⁵², TIAM-ECN^{53,54}, and WITCH^{55,56} (see also Supplementary Note 5). In addition to the Baseline, we model two energy independence scenarios with restrictions on regional energy imports, and Climate stabilization scenarios which stabilize GHG concentration at 450 ppm CO₂e or 500 ppm CO₂e (by 2100) or depict regional pathways consistent with recent climate Pledges³⁷. We follow a target-based policy approach by setting harmonized policy objectives and computing the corresponding policies and measures endogenously. The limitation of this study design is that it depicts stylized pathways to achieve policy objectives rather than the effects of specific policy instruments, which depend on the particular context of their application and interaction⁵⁷⁻⁵⁹. Investigating these dynamics requires more research

including modeling at the national and sub-national level. Additional information on the scenarios is available in the online database https://secure.iiasa.ac.at/web-apps/ene/LIMITSDB/.

Setting energy and oil dependence targets

Among those model regions that are also political jurisdictions, very few have explicitly defined energy independence targets. Japan is an exception; in its Basic Energy Plan from 2010^{33,34}, the country aimed to reduce its import dependence to 64% by 2030. This ambition was weakened in the INDC 2015⁶⁰ due to contraction in nuclear power after the Fukushima accident. Ukraine, South Korea, the European Union and Turkey plan measures (e.g. deployment of renewables and nuclear energy) that will affect their import dependence to a much smaller degree. The targets that we set for importing economies vary between 19-50% and thus are more ambitious than one of the countries with the strongest historical commitment to energy security^{61,62}. This is by design. If we were to model weaker, and perhaps more realistic energy independence policies, the energy and emissions impacts that we find would be even smaller.

We set the energy independence targets based on the 2010 level and the trend in the development of the energy system over the century (Table 2 and Supplementary Table 2). Developed regions with high net-import dependence today and low projected energy demand growth cut their energy imports in half by 2030 and maintain this level throughout the century. Developing and emerging economies with relatively lower energy imports today maintain their current level of net import dependence throughout the century; this contrasts with the development in most of these regions under the Baseline of rapidly rising energy imports. Finally, energy exporters never become importers. The U.S./North American region is projected to become energy independent within the next several decades even under the Baseline^{8,63-65}; thus for this region, we model energy independence by 2030 and maintaining that level throughout the century.

Import restrictions for oil independence are set as the same for all importing regions since most developing and emerging economies already have high net oil import dependence (Supplementary Table 3). All oil-importing regions cut their 2010 oil imports in half by 2030 and maintain that level throughout the century. The one exception is the U.S./North America region which achieves oil independence by 2030 since under the Baseline, it becomes self-sufficient in oil due to the development of unconventionals.

Regional energy and oil import restrictions are set for native model regions (Supplementary Tables 4-8). The independence targets are met with a 10% tolerance interval. Under Energy independence, in TIAM-ECN, the South Korean target was relaxed to 60% (from 45%) and small deviations were made in Mexico and Eastern Europe in the latter half of the century: in Mexico, the target was relaxed from no

imports to 31% import dependence and in Eastern Europe to 35% from a target net import dependence of 20%. In the Oil independence scenarios, in MESSAGE in the North America region the target was delayed till 2040. On the global level, these relaxations represent less than 5% of global energy trade and on the regional level, the energy independence levels are still quite stringent compared to the Baseline development.

Calculating net import dependence

Net import dependence (NID) is calculated by summing the net energy trade (imports minus exports) of all primary energy sources and secondary energy carriers for a give region and year and then dividing by the respective total primary energy supply (Equation 1). We calculate the NID for each model for all fuels which it trades (see Representation of energy trade in the models).

Equation 1 Calculating net import dependence

$$NID_{r,y} = \frac{\sum P \ imports_{r,y} + S \ imports_{r,y} - P \ exports_{r,y} - S \ exports_{r,y}}{Total \ primary \ energy \ supply_{r,y}}$$

where:

 $NID_{r,y}$ = the net energy import dependence in region r in year y,

 $P imports_{r,v}$ = the total primary energy imports,

 $S imports_{r,y}$ = the total secondary energy imports,

 $P imports_{r,v} =$ the total primary energy exports,

 $S imports_{r,y}$ = the total secondary energy exports, and

*Total primary energy supply*_{r,v} = the total primary energy supply.

The oilNID is calculated as the difference between crude oil and oil product imports and crude oil and oil product exports over the total oil supply (Equation 2).

Equation 2 Calculating oil net import dependence

$$oilNID_{r,y} = \frac{\sum \textit{C imports}_{r,y} + \textit{OP imports}_{r,y} - \textit{C exports}_{r,y} - \textit{OP exports}_{r,y}}{\textit{Total primary oil supply}_{r,y}}$$

where:

 $oilNID_{r,y}$ = the net oil import dependence in region r in year y,

 $C imports_{r,v}$ = the total crude oil imports,

 $OP\ imports_{r,y} =$ the total oil products imports,

 $C imports_{r,v}$ = the total crude oil exports,

*OP imports*_{r,v} = the total oil products exports, and

Total primary oil supply_{r,v} = the total amount of oil in the primary energy supply.

Representation of energy trade in the models

All our models depict energy trade between regions. This approach excludes intraregional trade (such as imports to Germany from Norway). This is however consistent with energy security policies and measures which often treat energy imports from neighboring suppliers differently than those from distant exporters^{24,66,67}.

Models differ on the types of energy trade they depict (Table 3). Energy import restrictions are imposed on all fuels which each model trades. Since all models represent oil, gas and coal trade, which account for almost all energy trade today, the starting point for regional net import level are similar. The scope of this paper is limited to trade in primary and secondary energy and excludes technological dependencies, which are also important for energy security²³ and could significantly change under different energy scenarios. More work is needed to understand these vulnerabilities and their evolution in the future.

Table 3 about here.

It should be noted, that net imports are not constrained by taxing fossil fuel technologies. Rather, models make energy imports (including 'new fuels' such as biofuels and hydrogen for those models which depict it — see Table 3) less attractive either by hard constraints on energy imports (in the optimization models) or by imposing a tax on imported fuels (in IMAGE, the simulation model). As a result, the neutrality of emissions of this target is an endogenous outcome.

Geographically, there are two main ways to represent energy trade in the models – bilateral trade and global pool trade. Under bilateral trade, one region sells energy directly to another region. In global pool trade, an energy exporter sells energy to a global pool which energy importers can buy from. For example in a model with only bilateral trade model, Middle Eastern oil exports would be sold directly to oil-importing regions such as Europe or India. In contrast, in a model with global pool trade, the Middle East would first sell its oil exports to a global pool, from which oil importing regions could buy.

Neither mechanism is a perfect representation of reality. Bilateral trade best represents direct trade between two countries such as natural gas trade in Europe where Russia sells natural gas directly to European countries and transports them via pipelines whereas global pool trade best represents much of the oil market. In IMAGE and TIAM-ECN, all energy trade is bi-lateral. In WITCH all energy trade goes through a global pool. REMIND also assumes a global pool but enhances this with differentiated regional trade costs to and from the pool. In MESSAGE, piped natural gas trade is bilateral between several regions (e.g. Europe and Russia) and all other energy trade goes through the global pool (including liquefied-natural gas and secondary fuels). The import restrictions are defined in the same way regardless of the energy trade mechanism and the results are robust regardless of which energy trade mechanism the model uses.

Implementing energy and oil independence targets

The optimization models (MESSAGE, REMIND, TIAM-ECN and WITCH) achieve the target energy import levels by imposing constraints on the net-import volumes (in exajoules) and not on net-import dependence level (in %-terms). The net-import level is determined by multiplying the target in the Energy and Oil independence scenarios, the import restrictions are imposed as volume constraints in relation to the primary energy development in the Baseline (total primary energy supply for the all import scenarios and total primary oil supply for the oil scenarios) rather than as proportion constraints. This avoids the model artifact of increasing the total primary energy supply (the denominator) to decrease overall energy dependence. IMAGE limits energy imports by imposing a tax on all imported energy. Since net import constraints include 'new fuels' such as biofuels and hydrogen for those models which depict it (Table 3), the neutrality of emissions of this target is an endogenous outcome.

Modeling climate pledges

The Pledges scenario depicts a world where all regions implement climate mitigation policies consistent with an ambitious interpretation of the Copenhagen pledges (Supplementary Table 1). This level of climate policy ambition is extrapolated beyond 2020 by projecting the GHG emission reduction rate which is achieved under the specified technology and GHG targets from 2020 to 2100. The Pledges scenario which we analyze is generally consistent with the INDC emission range from the Climate Action Tracker⁶⁸ over the short-term, which is also consistent with INDC 2030 estimates from REMIND⁶⁹ and PBL⁷⁰. See the last column of Supplementary Table 1 for the regional GHG emission reduction rate in each region from 2020-2100 and Kriegler et al.³⁸ for model-specific implementation.

Estimating policy costs and warming

Policy costs represent consumption losses over GDP for MESSAGE, REMIND and WITCH, all of which have a macro-economic component. For TIAM-ECN, policy costs represent additional energy system costs over GDP. IMAGE costs are excluded because the model is not able to calculate energy independence costs in a comparable way to the model's calculation of climate policy costs. GDP is expressed in market exchange rates. The real-world economic costs would depend on the choice of policy instruments and other factors. Costs do not include benefits from reduced warming.

The estimate of warming under the Energy independence scenario is based on a non-probabilistic parameterization of MAGICC 6^{71} ; all temperature estimates represent the median temperature response which carry a +/- 20% range of uncertainty with a 66% probability⁷².

Uncertainty analysis

The multi-model study design ensures that our findings are robust across model uncertainties including different solution mechanisms, representations of energy

trade and different methods for restricting energy imports (see Supplementary Note 2 and Supplementary Table 11). The model uncertainty covered in our study also spans a wide range of the literature, in both key inputs and outputs. Supplementary Figure 12 shows the Baseline development of key input parameters in our models to the Baseline scenario space in the IPCC AR5 database; Supplementary Figure 13 compares our key results for the 450 scenario to the 450 scenario space in the literature. We also test the robustness of our findings against parametric uncertainties by imposing the energy import restriction constraints in scenarios with three different Baselines based on SSPs^{45,73,74} which span a wide range of uncertainties (see Supplementary Note 3, Supplementary Figure 10). To test the robustness of our findings against the level of the import restriction target, we perform a sensitivity analysis using the MESSAGE model and vary the import restrictions both 50% higher and 50% lower than the main Energy and Oil independence scenarios (see Supplementary Note 4, Supplementary Tables 13 and 14 and Supplementary Figure 11).

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Additional information. Supplementary information is available in the online version of the paperCorrespondence and requests for materials should be addressed to J.J.

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