



Bearing the Cost of Stored Carbon Leakage

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Carbon capture and sequestration (CCS) is considered a key technology for stabilizing climate change. However, leakage of CO₂ from stored carbon can potentially undermine the value of carbon storage as a mitigation option. Thus, monitoring and verifiability of CO₂ storage should be encouraged through policy provisions such as accounting and pricing of leaked emissions. Here we assess different institutional and economic mechanisms for accounting for carbon leakage. Using an integrated assessment model we quantify the impacts on the climate, the economy and the mitigation strategies. Results show that carbon leakage can reduce the share of fossil based CCS by up to 35%, if it is controlled and correctly priced. Biomass based CCS is less affected. Accounting for leakage leads to an increase of climate policy costs of up to 0.4 percentage points due to increased emissions.

Keywords: carbon leakage, CCS, CO₂ geological storage, integrated assessment model, climate mitigation

HIGHLIGHTS

- Carbon leakage from CCS can lead to up to 25 GtCO₂ of additional emissions throughout the twenty-first century for a leakage rate of 0.1% per year.
- CCS deployment is lowered, by as much as 30% (Fossil) and 10% (BECCS), when leakage is taken into account.
- Carbon prices increase by around 5 per cent. Overall policy costs increase by about 0.2–0.4 percentage points.
- If not taken into consideration nor priced, leakage contributes to an additional 0.01–0.02 degrees of temperature increase.
- China, Latin America, the U.S., and Canada have the highest expected leakage.

1. INTRODUCTION

The increasing awareness of possibly irreversible damages of global warming has pushed both public opinion and governments toward the support of increasingly stringent climate mitigation measures. However, the path toward climate change policies is correlated to both technological and economic challenges (IPCC, 2014). Among typical mitigation strategies, Carbon Capture and Storage (CCS) and Carbon Dioxide Removal (CDR) represent valuable alternatives to renewable energy sources. According to existing studies IPCC (2014), the CCS potential will have an important role in reducing the carbon intensity of electricity. CCS might thus represent a considerable share

of emission reduction in the energy sector (Metz et al., 2005; Finkenrath, 2011; NAS, 2015; GCCSI, 2016).

CCS and CDR can also help reduce the costs of mitigation. Nonetheless, their development has not been as fast as expected in the last decades (Davidson et al., 2017). This low deployment can be associated with the absence of adequate incentives, lack of public acceptance, and to technological uncertainties associated with CCS (IEA, 2016; Lipponen et al., 2017). Among these barriers, carbon leakage from stored CO_2 could counteract the usefulness of carbon sequestration to help limiting global temperature increase (van der Zwaan and Smekens, 2009). In this paper, we analyze the impact of CO_2 leakage on the prospects of CCS in the power sector and the economic costs of mitigation¹.

We evaluate different policy provisions to help take leakage into account. Several problems can arise with leakage. Estimating its size is difficult and costly, since monitoring techniques have focused on small scale case studies so far (Romanak et al., 2012; Dethlefsen et al., 2013). A second source of uncertainty is related to the economic liability of leaked emissions (Wilson et al., 2003; Imbus et al., 2013). Finally, leakage might depend on the stringency of the climate policy. To address these questions, we use an integrated assessment model to examine three main dimensions: climate targets, leakage rates and policy provisions to counteract it. We consider the 2 and 1.5°C temperature increase targets by 2100, a range of possible leakage rates consistent with the literature, and different cases of pricing and liability of carbon leakage in the atmosphere. On this last point, we analyze whether leaked CO_2 is (a) not monitored nor taken into account in the carbon budget, (b) taken into account for the chosen carbon budget, but not priced at the carbon price, e.g., due to institutional or technological constraints, or (c) taken into account in the carbon budget and priced at the carbon price. These three cases allow us to disentangle the importance of monitoring and pricing leaked emissions.

2. BACKGROUND INFORMATION

2.1. CO_2 Transportation and Storage

Carbon dioxide, once removed from the exhaust gases of a power plant, can be re-used for industry purposes or stored (GCCSI, 2011). Capture, transportation, and storage or use each require the construction and maintenance of additional infrastructure, along with associated costs (Metz et al., 2005; GCCSI, 2011; Benson et al., 2012). After storage, transporting CO_2 to storage or use sites is the next important cost component. Although transportation through pipelines of dense supercritical CO_2 appears to be the most convenient technology for inland transport, other options, including shipping, are conceivable for particular cases (e.g., remote offshore distances) (Cole et al., 2011; ZEP, 2011). The costs for pipeline transportation comprise both capital costs (e.g., pipeline construction, pipe coating, protection systems) and operations costs (e.g., surveillance, maintenance, expert supervision) (McCoy and Rubin, 2008).

¹Note that we therefore do not consider direct air capture (DAC) or other CDR options, which face additional technical and other uncertainties.

When it comes to the options for carbon storage, here we focus on geological storage, which comprises several different storage options under ground. Among the different storage options, only a few are considered reliable for large scale injections: underground saline aquifers, depleted or expiring oil and gas fields, and coal beds. Deep saline aquifers are geological formations of porous rocks, permeable and saturated with water, that allow the withdrawal of non-potable water (IEAGHG, 2008). Also oil and gas fields where extraction is declining are interesting options for CO_2 storage. Enhanced oil recovery (EOR) consist of injecting CO_2 in declining oil fields to boost oil extraction due to fluid pressure. Being an economically convenient technique, it has already been used in the U.S. for many decades. However, traditional EOR was not intended to maximize carbon storage, and the amount of CO_2 trapped has always been relatively low (Godec et al., 2011; IEA, 2015). Depleted oil or gas fields can be reliable storage sites, as they have naturally stored natural gas for thousands of years and have been geologically fully characterized. Coal seams that are uneconomic to mine may still contain methane trapped in coal pores, which may be released via Enhanced Coal Bed Methane (ECBM) recovery (IEA-ETSAP, 2010). Similar to EOR, ECBM consists of injecting CO_2 into the coal bed, some of which displaces the CH_4 and remains sequestered in its place. Other potential CO_2 storage options, such as CO_2 mineralization or deep ocean storage, although considered important potential future storage options by some sources (Sanna et al., 2014; Romanov et al., 2015), are excluded from the current study due to their high current and uncertain future costs, public acceptance issues, and uncertain impacts on ecosystems (IEA, 2008).

Since estimating global or regional available storage capacity requires extensive investigation of vast geological areas and the use of advanced measurement processes, the uncertainty on available capacity is still high. Dooley (2013) considers a theoretical global capacity of 35,300 $GtCO_2$, which is reduced to an effective and then practical potential of 13,500 and 3,900 $GtCO_2$, respectively. In the IEAGHG (2011, 2016) reports, an average global availability of 11,152 $GtCO_2$ is estimated, which is an order of magnitude that is accepted also by other authors (Hendriks et al., 2004; Koelbl et al., 2014).

With regard to the geological storage costs, the variability in the literature is even higher, since many studies describe specific sites, which can have different properties one from another, such as the storage type, regional geology, and pre-built infrastructure. For example, Rubin et al. (2015) estimates a cost range of between 1 and 18 $\$/tCO_2$. Similar values are reported in IEAGHG (2011) and ZEP (2011)². Concerning ECBM and EOR storage options, the estimated costs range from negative to high positive values, depending on whether the process is used to boost gas or oil extraction, or to optimize CO_2 storage (Gale, 2004; Koelbl et al., 2013, 2014).

2.2. Carbon Leakage

With the term leakage, or seepage, we refer to undesired CO_2 losses to the atmosphere due to infrastructure or

²Every cost in this study is expressed in 2005 US Dollars.

storage malfunctions. Leakage could occur during CO_2 transportation, underground injection, or after storage. Leakage from transportation is due to pipeline losses, but can be considered unlikely due to pipeline monitoring systems that measure pressure losses (GCCSI, 2014). The injection process can also lead to unwanted CO_2 leakage: injection requires a wellbore, a conduit where upward flows are possible. Finally, undesired loss of CO_2 from storage sites can occur due to imperfect storage sealing. Pipeline and injection losses are referred to as instantaneous leakage, as they take place at the same time period of capture and before the CO_2 is stored. On the contrary, seepage from storage sites is delayed in time, meaning that CO_2 can also leak from under ground several years after being captured. In this case, leakage is related to the cumulative quantity of CO_2 that has been stored in the past. This aspect is critical as one of the main issues related to CCS deployment is the long term suitability of storage options (Metz et al., 2005; van der Zwaan and Gerlagh, 2009b). Moreover, there is still high uncertainty about the true reliability of storage sites. As the long term response of storage sites could hinder CCS effectiveness as a mitigation option, we focus our attention on storage leakage.

The damages that leakage might cause can be distinguished between local and global (Wilson et al., 2003). From the local point of view, meaning a few kilometers around the storage site, concentrated CO_2 leakage could be harmful for people and livestock. Another problem caused by CO_2 losses is ground water contamination. Seepage could reach groundwater aquifers, rather than reaching directly the atmosphere surface (Bielicki et al., 2015; Deng et al., 2017). This would lower the aquifer water pH and could lead to the release of harmful metals, an effect known as acidification (Little and Jackson, 2010). Alternatively, acidification might also occur during the injection in saline aquifers, degrading the well cements (Celia et al., 2015). These local issues might raise discussions on storage management and public acceptance, however they have less consequences at a global level. By contrary, this article focuses on CO_2 leakage into the atmosphere as a global issue that contributes to global warming. In particular, the prospect of leakage could hinder the mitigation potential of fossil fuel CCS, hampering its future deployment. Consequently, it would lead to an increase in climate policy costs (van der Zwaan and Smekens, 2009). For this reason it is important to understand the magnitude of leakage, which is captured typically through the leakage rate, that is, the rate at which CO_2 leakage occurs at a specific storage site per year in terms of the stored carbon.

Bielicki et al. (2015) summarizes results on percentage of stored emissions from the storage sites, with different levels of permeability and compares the results with the U.S. Department of Energy aim of not more than 1% leaked CO_2 in total (Bielicki et al., 2016). Assuming a pessimistic estimate of rock permeability equal to $10^{-10}m^2$, 10% of stored volumes are expected to leak within 30 years, with permeability of $10^{-12}m^2$, the leaked emissions decrease to about 0.1% during the same period. However, an evaluation of leaked quantities over larger time horizons like 100 or 1,000 years, which are the time frames usually considered by institutions like the DOE or IPCC, is still missing. According to Bielicki et al. (2015) only the case with

$10^{-12}m^2$ permeability would conform to the storage permanence goal of 1% leakage. These permeability assumptions have been tested in the GCAM model by Deng et al. (2017), obtaining leakage over the twenty-first century of between ~ 0.003 and $\sim 0.2\%$ ³. Another finding is that with a low injection rate, leakages are higher at the beginning, while in the long term this might change. The behavior of leakage rates could therefore depend also on time: in particular, the percentage of CO_2 lost with respect to the total stored amount could exponentially decay or show an S-shaped behavior. These complex paths try to replicate some important geological and fluid-dynamic aspects of CO_2 leakage. For example, the exponentially decaying curve stands for a storage site where CO_2 leaks at first easily, then increasingly more scarcely due to the fact that only the best trapped CO_2 remains in the storage site. An S-shaped curve would represent the CO_2 leaking through multiple layers of media (van der Zwaan and Gerlagh, 2009a,b). However, as in van der Zwaan and Smekens (2009), leakage rate could be also reasonably well approximated as a constant percentage of the cumulative stored quantity within each storage site. Summing up, according to the IPCC (Metz et al., 2005), storage sites are probably reliable and safe, meaning they release very low or practically zero leakages. van der Zwaan and Smekens (2009) suggest a maximum acceptable value for the leakage rate below 0.5% per year, while for Bielicki et al. (2015) lower leakage rates are conceivable. In this study we therefore consider the maximum leakage rate of 0.1% per year, which implies leakage of 9.5% over a century, while a more reasonable leakage rate that we test is 0.01%/year, which leads to a theoretical leakage of 1% of injected CO_2 over 100 years⁴.

As leakage remains uncertain, it is of vital importance to ensure effective and reliable monitoring systems that consistently measure CO_2 flows. In recent years, several studies have addressed the issue of monitoring leakage flows to the atmosphere or affecting underground aquifers (Benson and Hepple, 2005; Dethlefsen et al., 2013). Monitoring seepage implies scanning a large area of land in proximity of storage sites, and there is not a consolidated or standardized approach yet, rather a number of research and demonstration projects (Jones et al., 2009; Etheridge et al., 2011; Romanak et al., 2012). Moreover, to guarantee an effective control on storage sites, the responsibilities and consequences of seepage must be clearly outlined, covered through appropriate regulation and, if applicable, covered under carbon pricing schemes (Imbus et al., 2013). Problems can arise when private companies or public institutions responsible for the injected CO_2 do not monitor adequately, leading to undetected leakage. Considering the long term outlook, some regulations envisage a transition in responsibilities from private operators to governments after a certain number of years (e.g., 50 years) or in case of company closures. Furthermore, assuming leakage occurs and is correctly detected and measured, someone has to pay for local damages

³Note that these values are modeled leakage rates over the century and thus depend on the timing and deployment of CCS and carbon storage.

⁴These values per century are theoretical, meaning the amount of gas that would leak if it was all stored on the first year. The real leakage per century will depend on the intertemporal storage profile of the model, see **Figure 2**.

and for the cost of global externality it is generating. In the case of a carbon pricing scheme, the latter cost is set by the carbon price. Also in this case, dodging responsibility by private or public authority would inhibit the economic benefits of CCS or CDR.

Not all countries have appropriate or specific regulation to address the safety and liability issue. Liu et al. (2016) provides a review of existing regulations in some developed countries and compares them with general Chinese environmental regulation. As an example, EU regulation establishes the payment for emissions credits in the Emissions Trading System (ETS) system for the storage operator (EU, 2009). Other useful measures are insulation of the perforation of the well, re-injection in more safe sites and insurance plans, also for companies that go bankrupt (Lackner and Brennan, 2009; Imbus et al., 2013). In conclusion, we have seen how important it is to assign responsibilities for monitoring and compensate leakage damages. Therefore, we included these aspects in this exercise, developing some scenarios that mimic successful or failed monitoring, pricing, and management of stored emissions.

3. METHODOLOGY

We use an integrated assessment model (IAM) to simulate the impact of leakage on the set of mitigation strategies. IAMs are tools which are routinely used to evaluate global climate policies. Currently, many integrated assessment models use aggregated storage cost and availability curves, notably the ones from Hendriks et al. (2004). For this exercise, we disaggregated the storage according to different types of storage including their respective potential and costs. Moreover, transportation costs also vary according to the storage site considered. Finally, we added leakage from the different storage sites and assessed a set of scenarios capturing different climate policies, leakage rates, and options to consider leaked carbon emissions. We use the WITCH (World Induced Technical Change Hybrid) integrated assessment model in this study.

WITCH is a global integrated assessment model with two main distinguishing features: a regional game-theoretic setup, and an endogenous treatment of technological innovation for energy conservation and decarbonization (Emmerling et al., 2016). A top-down inter-temporal Ramsey-type optimal growth model is hard linked with a representation of the energy sector described in a bottom-up fashion, hence the hybrid denomination. The regional and intertemporal dimensions of the model make it possible to differentiate and assess the optimal response to several climate and energy policies across regions and over time. The non-cooperative nature of international relationships is explicitly accounted for via an iterative algorithm which yields the open-loop Nash equilibrium between the simultaneous activity of a set of representative regions. Regional strategic actions interrelate through greenhouse gas (GHG) emissions, dependence on exhaustible natural resources, trade of fossil fuels and carbon permits, and technological research and development (R&D) spillovers. R&D investments are directed toward either energy efficiency improvements or development

of carbon-free breakthrough technologies. Such innovation accumulates over time and spills across countries in the form of knowledge stocks and flows. R&D investments, along with investments in energy technologies and the final goods sector, are endogenously determined in the intertemporal optimization. Within the energy sector, for new renewable energy sources (wind and solar), battery development, and advanced bio-fuels, learning is also taken into account through one or two factor learning curves, which determine future capital costs. The competition for land use between agriculture, forestry, and bioenergy, which are the main land-based production sectors, is described through a soft link with a land use and forestry model (GLOBIOM, Global Biosphere Management Model). A climate model (MAGICC) is used to compute climate variables from GHG emission levels, and an air pollution model (FASST) is linked to compute air pollutant concentrations.

Concerning CCS in the model, we consider four coal technology options (including the possibility of retrofitting existing plants), one gas and one biomass technology with carbon capture. The model includes seven types of storage (saline aquifers, EOR sites, depleted oil and gas fields, all either onshore or offshore, and onshore ECBM sites), each characterized by a maximum available capacity, a storage cost and an average distance from power plants. Apart from storage costs for the different types, all values are regionally differentiated. Finally, we account for an average specific transport cost dependent on the distance calibrated as $c'_{tr} = 0.006667\$/tCO_2 \text{ km}$ (Rubin et al., 2015). The total cost of captured CO_2 transport and storage $C_{t\&s}[\$/year]$ is therefore evaluated according to the following equation, where the dimensions are time (t), regions (n), and type of storage (k_{st}):

$$C_{t\&s}(t, n) = \sum_{k_{st}} Q_{st}(k_{st}, n, t) \cdot (c'_{tr} \cdot l_{tr}(n, k_{st}) + c_{st}(k_{st})) \quad (1)$$

Here, $Q_{st} [GtCO_2/year]$ represents the yearly quantity of CO_2 captured by CCS plants, $l_{tr} [km]$ represents the average distance, and $c_{st} [$/tCO₂]$ the storage cost. We consider an annual leakage rate λ_{lk} of between 0.0%/year and up to 0.1%/year and include leaked emissions in the model. The cumulative amount of CO_2 stored $CUM_{st} [GtCO_2]$ is therefore calculated based on annual stored values, considering that the model is run at a time step of 5 years, and including possible leakage every time period:

$$CUM_{st}(k_{st}, n, t + 1) = CUM_{st}(k_{st}, n, t) \cdot (1 - \lambda_{lk}(k_{st}, n, t))^5 + 5 \cdot Q_{st}(k_{st}, n, t) \quad (2)$$

Here, λ_{lk} stands for the leakage rate, or the percentage of CO_2 stored in the previous year that is lost due to leakage and emitted in the atmosphere. This set of equations allow us to represent the transport and storage chain as a single cost function, differentiated across regions. The cost function for each storage type follows a step increase in function of the cumulative stored quantity, where each step means a switch from a cheap but

replete storage type to the immediate next, more expensive site. Finally, annual leaked emissions Q_{leak} are computed as follows:

$$Q_{leak}(n, t) = \sum_{k_{st}} \lambda_{lk}(k_{st}, n, t) \cdot CUM_{st}(k_{st}, n, t) \quad (3)$$

It should be noted that Q_{leak} in period t is accounted for based on CUM_{st} in t , which is not including the emission captured in the same period, but only until $t - 1$. This is to represent delay in leakage.

4. SCENARIO DESIGN

Based on this model implementation of storage, transportation, and leakage of CO_2 , we explore a set of 31 scenarios to capture the following dimensions: leakage rates, climate targets, and policy provisions. We implement different leakage rates (LR) starting from zero leakage, 0.01%, 0.05%, and up to 0.1% per year.

Secondly, we consider different stringency of climate policies, represented by carbon budgets covering total CO_2 emissions from fossil fuels and industrial processes from 2010 to 2100. In addition to the business as usual (BAU) case without a future climate policy, we consider cases of 550, 1,000, and 1,600 $GtCO_2$ corresponding to roughly 1.5, 2.0, and 2.5°C of global warming in 2100, according to the definition in the IPCC AR5 report (Edenhofer et al., 2014; Vuuren et al., 2017)⁵. When running these scenarios, the model sets a constraint on emitted CO_2 equal to the budget and solves finding the cost optimal solution for attaining the target.

Finally, we differentiate the economic and policy treatment of carbon leakage emissions. In particular, we consider whether or not (a) leaked emissions are priced (through a carbon tax or the price of emission permits) or not, and (b) the leaked emissions are included in the carbon budget of the policy maker. Four cases are possible based on these distinctions: In the first case (NN), leakage is not taken into account in the policy target nor priced, e.g., due to technical, institutional, or political barriers. This case allows us to assess the climatic impact of leakage if it is not taken into account for climate targets, nor in emission pricing schemes. The other limiting case, where pricing and monitoring are effective (YY), constitutes the first best case where the actual climate target is attained, and leakage is treated the same way as other carbon emissions and priced at the marginal cost of abatement. The two remaining cases represent different institutional, economic, and technological situations: In the YN case, leakage is anticipated for the climate policy goal, while due to monitoring or institutional constraints, the source cannot be taxed or held accountable. Hence, in this case, other mitigation options are required to counteract leakage emissions. Hypothetically, in the fourth situation (NY), on the other hand, pricing leakage emissions is possible and implemented, but the climate policy does not take leakage into account a situation which is not realistic and hence we do not consider it here.

⁵The IPCC AR5 Scenarios Database documents the long-term scenarios as reviewed in the Fifth Assessment Report (AR5) of Working Group III of the Intergovernmental Panel on Climate Change (IPCC) (Edenhofer et al., 2014).

TABLE 1 | Scenarios considered (31 in total).

(A) THREE CASES REPRESENTING LEAKAGE MONITORING AND LIABILITY			
		liability	
		No	Yes
monitoring	No	NN leakage not accounted in carbon budget, nor priced	[Not realistic]
	Yes	YN leakage accounted in carbon budget, but not priced	YY leakage accounted in carbon budget and correctly priced

(B) BAU AND THREE CARBON BUDGETS [GtCO ₂ BY 2100]	(C) FOUR LEAKAGE RATES
Climate target	Leakage rate (%/year)
BAU	0.00%
1,600	0.01%
1,000	0.05%
550	0.10%

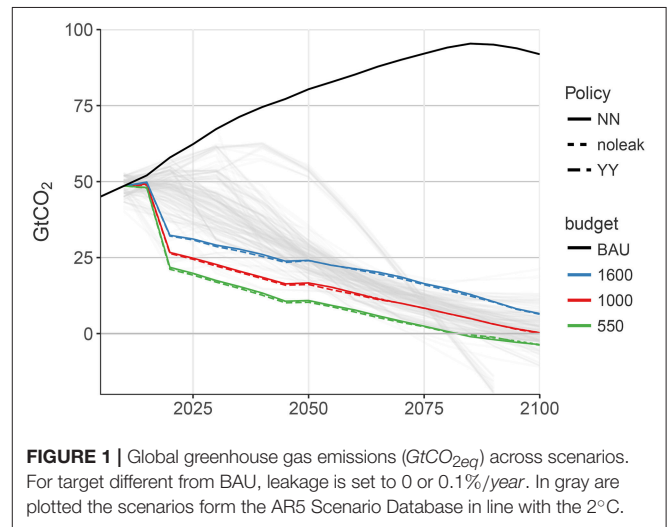
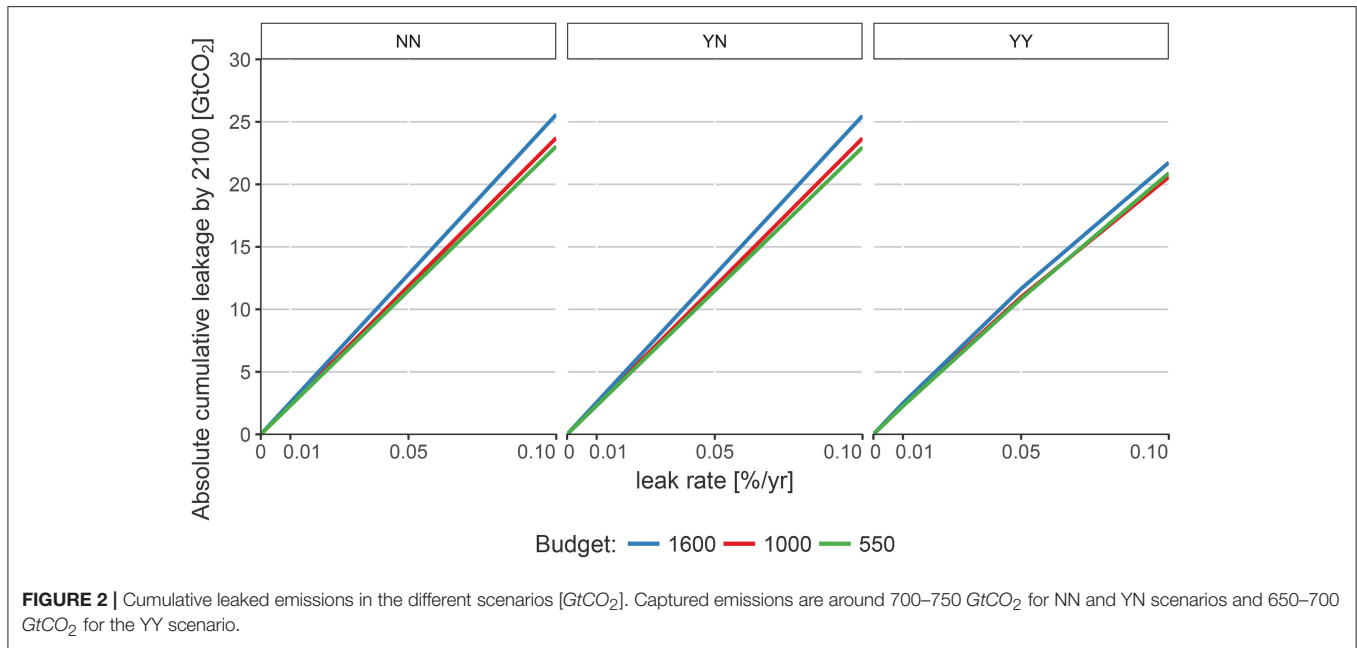


FIGURE 1 | Global greenhouse gas emissions ($GtCO_{2eq}$) across scenarios. For target different from BAU, leakage is set to 0 or 0.1%/year. In gray are plotted the scenarios from the AR5 Scenario Database in line with the 2°C.

As summarized in Table 1, we consider three different policy prescriptions (NN, YN, YY) for three different carbon budgets (1600, 1000, 550 $GtCO_2$) and three leakage rates (0.01, 0.05, 0.1 %/year, total: 27 scenarios), in addition to the four scenarios without leakage (BAU, 1,600, 1,000, 550).

5. RESULTS

The different sets of scenarios show different patterns in terms of emissions, CCS deployment, and economic costs. Firstly, looking at overall greenhouse gas emissions, Figure 1 shows the no leakage and high leakage scenarios and compares them to the scenarios of the AR5 database that are consistent with the two degree target (Edenhofer et al., 2014). Overall, emissions



are only mildly affected by carbon leakage at the global scale, and the mitigation pathways are dominated by the stringency of the carbon budgets. In particular in the 550 scenarios, total emissions become negative toward the end of the century. The difference between cases where leakage (set as 0.1%/year of stored CO₂) is well accounted for (YY) and when it is not (NN) is small compared to total emissions, though still visible.

Looking closer at the leaked emissions, one can see that leakage can contribute to emissions as shown in **Figure 2**. The amount of leakage over this century in the NN and YN scenarios ranges from 2.5 GtCO₂ (for a leakage rate of 0.01%/year) to around 25 GtCO₂ for a leakage rate of 0.1%/year. Moreover, while it is quite similar for the different climate targets, it shows the highest values always for the 1,600 GtCO₂ scenario, where fossil-based CCS is widely deployed. Comparing the leakage to the amount of captured emissions for the NN and YN scenarios (around 700–750 GtCO₂), we get around 0.5% of leakage until 2100 for the low leakage rate, and 3% for the high leakage rate cases. These values are virtually unchanged in the YN and NN scenarios, where leakage is not priced and hence does not affect CCS deployment. However, in the YY scenario, when the effect and cost of leakage are fully accounted for, the model responds with a reduction in leakage, linked to a reduction in CCS technology adoption and captured emissions. For the highest leakage rate of 0.1%, captured emissions are lowered by about 5–10 GtCO₂ across the different climate targets. The percentage of leaked emission on the total captured between 2015 and 2100 is however similar to the previous scenarios. If compared to Deng et al. (2017), our results show higher percentage of emission leaking over the century given similar leakage rates. This is due to their assumption that most of leaked emissions do not reach the

surface, but are priced and thus have a negative impact on CCS deployment.

Leaked emissions have an impact on the climate, in terms of CO₂ concentrations and global temperature increase, shown in **Figure 3**. In absolute terms, variations in global mean temperature increase in 2100 are relatively small, of the order of magnitude of 0.01°C when leaked emissions are not monitored. For the YN and YY scenarios where leakage is accounted in the carbon budget target, the results show a small temperature decrease with increasing leakage rate. This can be explained due to different timing of emissions, notably due to the early shift to zero carbon technologies replacing CCS. While overall the temperature effect is relatively small, it still implies further exacerbation of global warming when leakage is not accounted in the budget, which might be relevant for the most stringent scenarios.

Figure 4 shows that the reduction in CCS (in terms of capacity reduction by 2100) is linked to the leakage rate, and to whether it is priced and accounted for in the carbon budget: only in the case where the costs of leaked emissions are accounted for in the economy through carbon pricing (YY) is CCS substantially reduced. Therefore, in the scenarios where countries do not pay for their leaked emission, CCS is not affected, both in the case where seepage is considered in the carbon budget or not (YN and NN scenarios). This result can be explained since leakage can not be directly linked to the storage owners and the capturing power plant. The CCS reduction is particularly high for fossil fuel based CCS where the reduction reaches between 10 and up to 35 per cent of the capacity without leakage. Bio-energy with carbon capture and storage (BECCS), on the other hand, shows reductions lower than 10%. That is, for biomass CCS, leakage seems to provide a less important barrier, even with a leakage

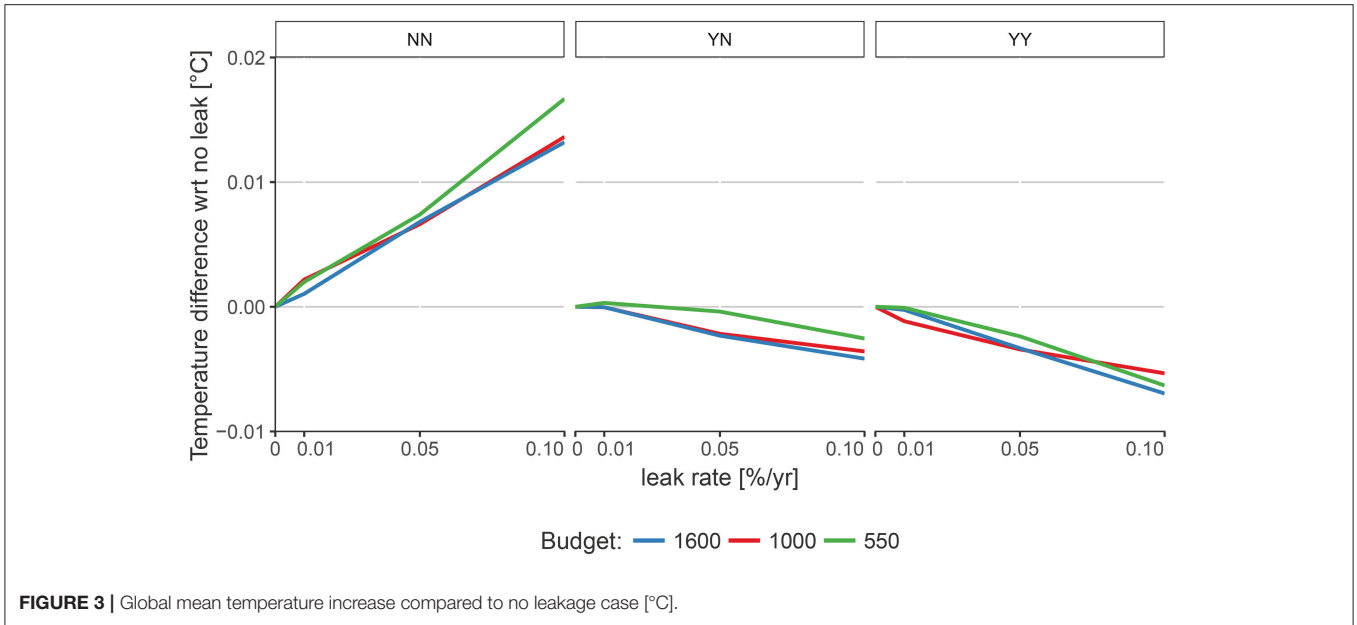


FIGURE 3 | Global mean temperature increase compared to no leakage case [°C].

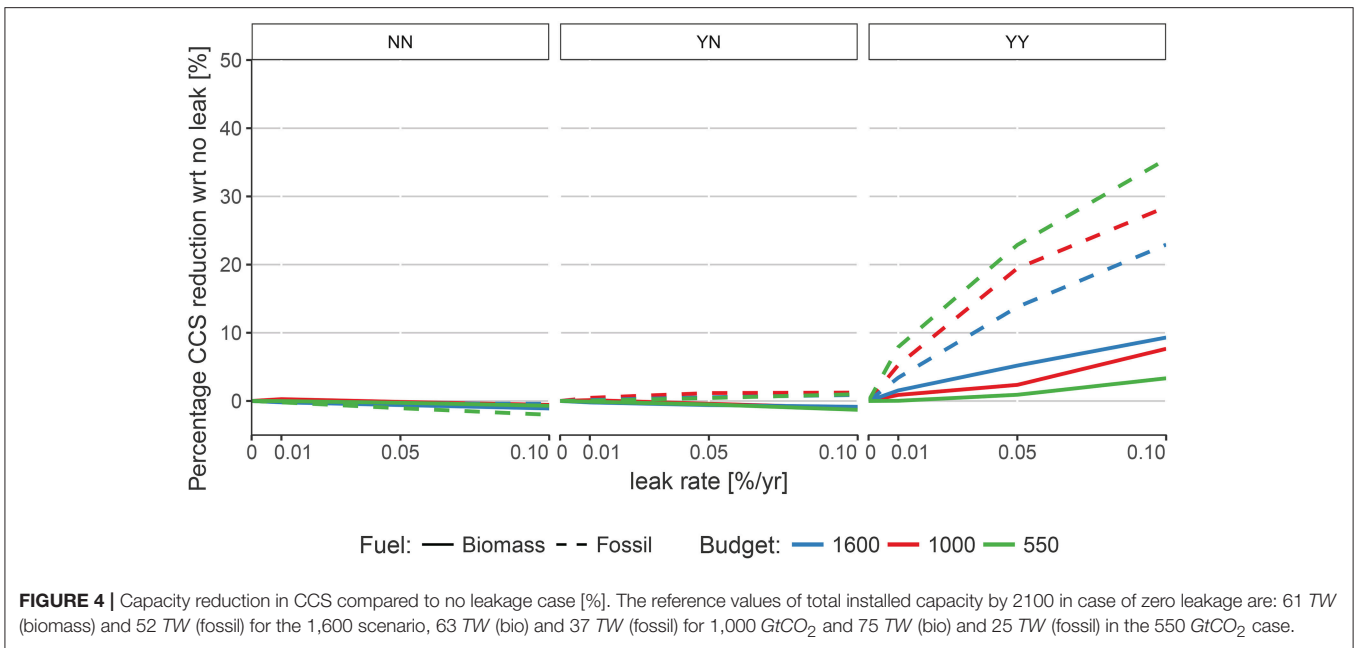


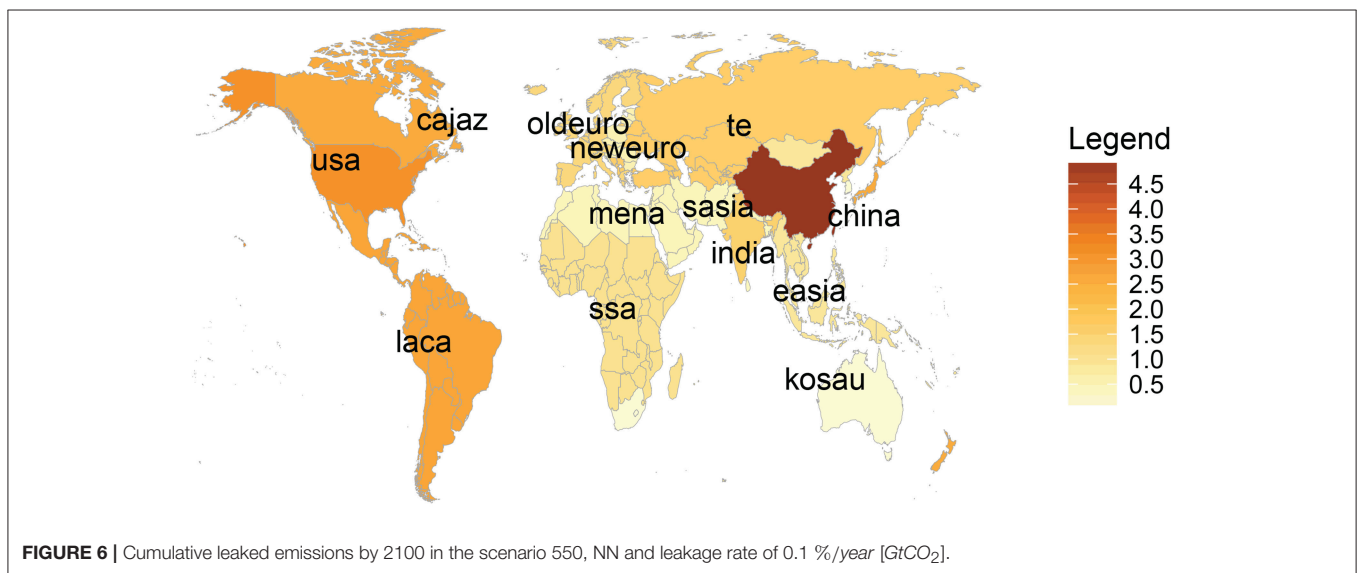
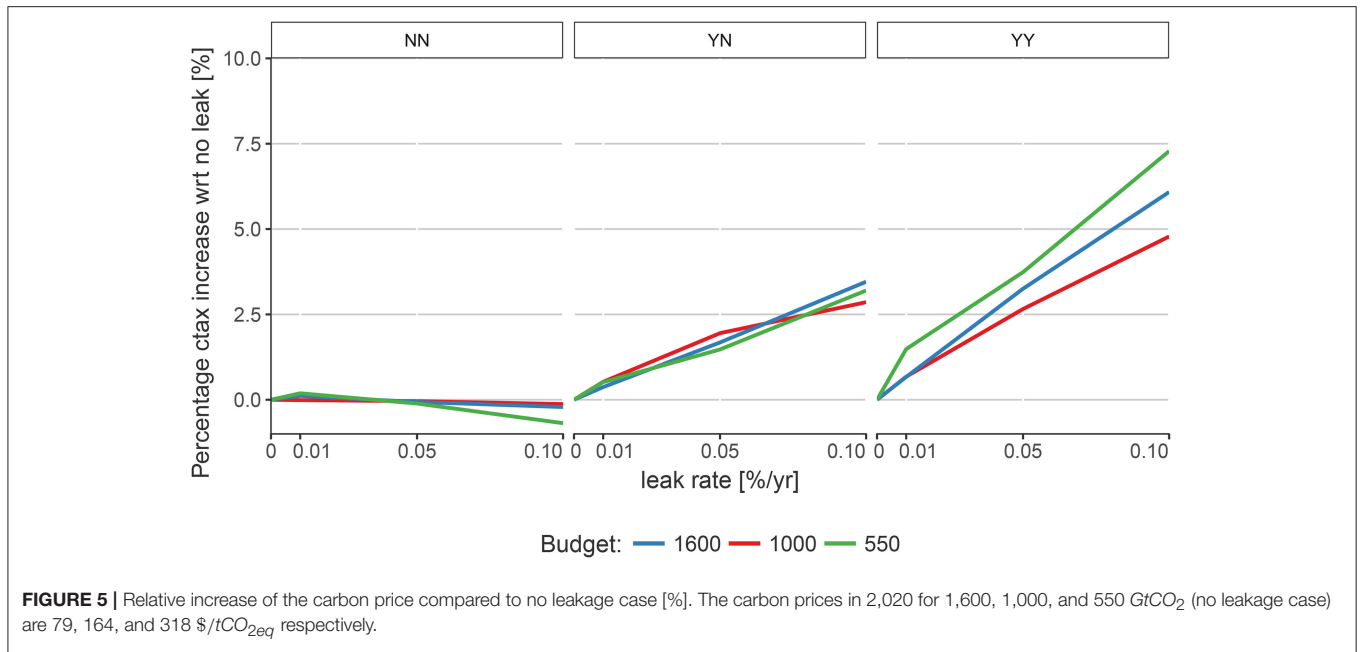
FIGURE 4 | Capacity reduction in CCS compared to no leakage case [%]. The reference values of total installed capacity by 2100 in case of zero leakage are: 61 TW (biomass) and 52 TW (fossil) for the 1,600 scenario, 63 TW (bio) and 37 TW (fossil) for 1,000 GtCO₂ and 75 TW (bio) and 25 TW (fossil) in the 550 GtCO₂ case.

rate of 0.1% per year, especially in the most stringent 1.5°C scenario. Moreover, it is interesting to note that the ordering across stringency of the climate targets is reversed for fossil fuel and biomass based CCS: The more stringent the scenario considered, the lower the impact on BECCS and the higher the reduction of fossil based CCS. This result is in line with the intermediary role of fossil fuel based CCS found e.g., in Rogelj et al. (2015), van der Zwaan and Smekens (2009) and Deng et al. (2017), even if these two latter studies did not consider stringent scenario such as the 1.5°C (550 GtCO₂).

In terms of economic costs of carbon leakage, we first look at the implied carbon price required to meet the different climate

targets. **Figure 5** shows the increase in carbon price with respect to the no leakage cases, noticeable for scenarios where leakage is included in the carbon budget. The standard carbon prices in the three scenarios in the year 2020 to implement the carbon budgets of 1,600, 1,000, and 550 GtCO₂ are 79, 164, and 318 \$/tCO_{2eq} respectively, and grow at a rate of 5% per year⁶. Comparing to these default scenarios the leakage cases, first note that the NN scenario does not show any change in the carbon price as leakage increases, since it is not considered for the policy

⁶Note that therefore the relative difference in carbon prices shown in **Figure 5** are constant over time and across regions.



design. When seepage affects the carbon budget available for each climate policy, it becomes necessary to mitigate this effect using other technological strategies more expensive than CCS. This results in an increase of carbon price in the YN and YY scenarios, which ranges from 2.5 to 7.5%. When leakage is not priced (YN), it still leads to a higher carbon price due to the reduced global carbon budget, albeit to a lesser extent, resulting from higher mitigation effort based on the most cost-effective mitigation options available. When it is also priced, the cost-effective potential of CCS is significantly reduced, resulting in higher use of more expensive mitigation options such as energy efficiency improvements or renewable energy sources. Across carbon budgets, it should be noted that, although the relative

variation in the carbon tax is similar, in absolute value it differs significantly.

The previous results showed how uncontrolled seepage would affect global climate and how, even well monitored leakage might be binding for CCS development and would lead, globally, to a more expensive energy system. Now we focus on the regionally differentiated modeling results, focusing here on the most stringent scenario (550) and using the 0.1% leakage rate, while for smaller rates the results scale down almost linearly as shown before.

As shown in **Figure 6**, the cumulative leaked emissions are not evenly distributed across regions: China, the United States, Canada/Japan (cajaz), and Latin America (laca) countries are

expected to extensively use CCS power plants, and therefore are projected to leak more than 2 GtCO₂, with China reaching 5 GtCO₂ by 2100 (see Table 2 for the description of the regions).

Given the relatively high carbon price required to achieve the stringent climate policy targets, leakage can imply substantial additional costs of emissions, according to the carbon price in place. In the aforementioned regions with high projected leakage potential, this amounts to values between 75 and 200 billion USD over the century, with exception of 550 billion for China, see the left panel in Figure 7 (all values reported there refer to NPV cumulative values from 2015 to 2100, discounted at a 5% discount rate). In the scenario 550, NN with high leakage, the (discounted) yearly value of leaked emissions in 2100 reaches up to 12 billion USD in China and about 7 billion USD in Latin America. Globally, the yearly leakage in 2100 of 0.78 GtCO₂ amounts to a discounted value of 54 billion USD. Given the relatively small carbon budget consistent with the 1.5 degree scenario, the additional 25 GtCO₂ of leaked carbon

emissions associated with the high leakage rate (0.1%/year) scenario represent a significant cost, with particular economic implications for some regions. Moreover, we can compare which regions have to bear the additional costs if, while initially not being priced, now leaked emissions are accordingly priced and the climate target is the same, i.e., moving from scenario YN to YY. The right part of Figure 7 shows the additional cost of leakage emissions when they are priced at the global carbon price (YY) compared to the case where they are not (YN): almost all regions show a negative difference, meaning that they reduce expenses when leakage is well regulated. In Canada/Japan (cajaz), including the leakage costs in the economy does not lead to a large CCS reduction. Therefore, the higher carbon price in the YY scenario results in higher costs for the country. This occurs mainly because the use of BECCS late in the century seems essential for these countries. In countries where CCS is only marginally profitable, its optimal deployment is reduced facing leakage, and hence the required carbon price is slightly higher, while leakage is significantly reduced. Since the latter effect dominates, those countries gain in terms of the value of carbon.

These are the value of losses that would not be paid by companies or countries in absence of regulation. But they can also be seen as a waste of money for a country which is investing in climate mitigation policies, and the cost of rebating leaked emission. Moreover, other costs, like local or climate change damages are not accounted in this estimation, therefore the real economic loss might be even higher. Note that in both cases the carbon price increases with leakage rate, as more expensive low carbon technologies are installed to compensate seepage. However the YY scenario represents a perfect regulation system where CCS owners pay for the leaked emissions, so that use of CCS is reduced and the carbon price increases further. This behavior is considered more convenient than continuing using CCS and paying for leakage. The difference in total leakage costs can be considered as the regional gain or loss if leakage is well regulated or not. Moreover, we also compare the GDP of all scenarios to

TABLE 2 | Regions of the WITCH model.

WITCH region	Description
usa	United States of America
oldeuro	Western Europe (EU15+EFTA)
neweuro	Eastern Europe (EU12+European EITs excluding FSU countries)
kosau	South Korea, South Africa, Australia
cajaz	Canada, Japan, New Zealand
te	Non-EU Eastern European countries, including Russia
mena	Middle East and North Africa
ssa	Sub Saharan Africa
sasia	South Asia (except India)
china	China, including Taiwan
easia	South East Asia, including Indonesia
laca	Latin America, Mexico and Caribbean
india	India

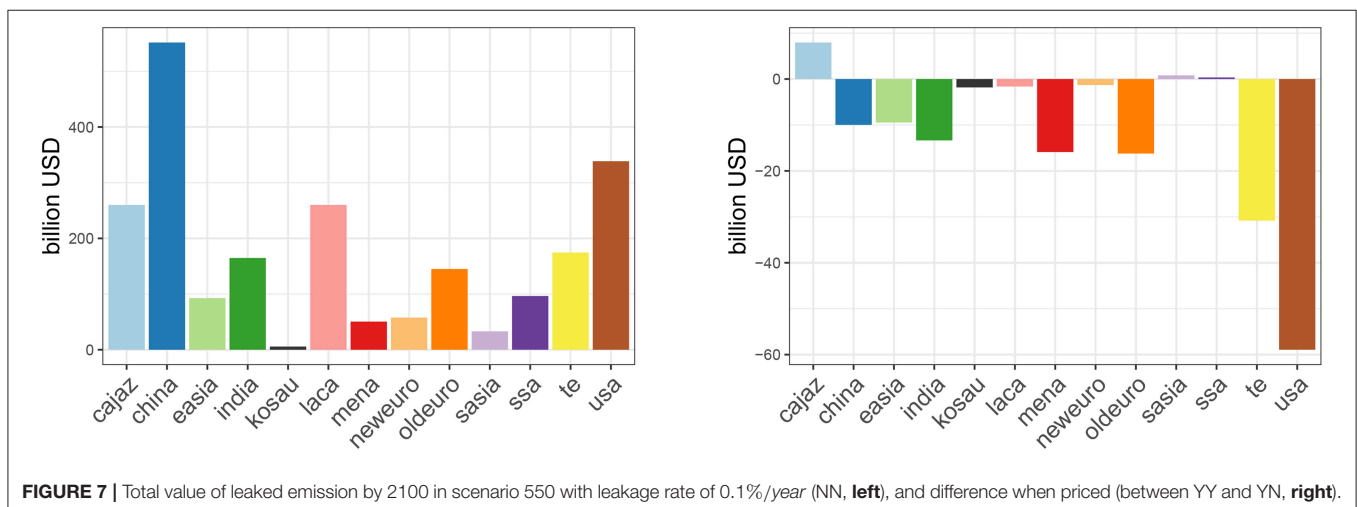


FIGURE 7 | Total value of leaked emission by 2100 in scenario 550 with leakage rate of 0.1%/year (NN, left), and difference when priced (between YY and YN, right).

TABLE 3 | Policy Cost with respect to BAU for different leakage rates and pricing policies [% of GDP].

Leakage rate	0	0.01%/year		0.05%/year		0.1%/year	
		YN	YY	YN	YY	YN	YY
1,600	3.38	3.39	3.40	3.42	3.47	3.46	3.54
1,000	5.64	5.66	5.68	5.72	5.75	5.77	5.86
550	8.52	8.53	8.55	8.56	8.68	8.64	8.86

analyze the changes in policy costs with respect to the BAU scenario. **Table 3** reports the policy cost for the aforementioned scenarios. We confirm the above mentioned trend of policy cost⁷ increasing with leakage rate and from zero leakage case to YY setting. Overall, policy costs increase in the range of 0.1–0.2% in the YN case due to the higher mitigation effort needed. If moreover leakage is priced, they increase by a further 0.1–0.2 percentage points. For instance, in the stringent 550, YY scenario and for a leakage rate of 0.1%, the costs of staying below 1.5° increase from 8.5% to almost 8.9% due to leakage.

6. CONCLUSION

The purpose of this work is to expand the assessment of leakage impact on CCS deployment and climate policies. We consider different institutional and economic settings reproducing issues in monitoring and paying for possible leakage. Furthermore, we perform analysis over leakage rates, and over three different climate scenarios, including the 1.5 and 2°C temperature increase

⁷measured as NPV of GDP differences in global GDP discounted at a 5% rate.

REFERENCES

- Benson, S., and Hepple, R. (2005). "Detection and options for remediation of leakage from underground CO₂ storage projects," in *Greenhouse Gas Control Technologies* (Vancouver, BC).
- Benson, S. M. K., Bennaceur, P., Cook, J., Davison, H., de Coninck, K., Farhat, A., et al. (2012). "Chapter 13-carbon capture and storage," in *Global Energy Assessment-Toward a Sustainable Future* (Cambridge, UK; New York, NY: Cambridge University Press; Laxenburg: International Institute for Applied Systems Analysis), 993–1068.
- Bielicki, J. M., Peters, C. A., Fitts, J. P., and Wilson, E. J. (2015). An examination of geologic carbon sequestration policies in the context of leakage potential. *Int. J. Greenhouse Gas Control* 37, 61–75. doi: 10.1016/j.ijggc.2015.02.023
- Bielicki, J. M., Pollak, M. F., Deng, H., Wilson, E. J., Fitts, J. P., and Peters, C. A. (2016). The leakage risk monetization model for geologic CO₂ storage. *Environ. Sci. Technol.* 50, 4923–4931. doi: 10.1021/acs.est.5b05329
- Celia, M. A., Bachu, S., Nordbotten, J. M., and Bandilla, K. W. (2015). Status of CO₂ storage in deep saline aquifers with emphasis on modeling approaches and practical simulations. *Water Resour. Res.* 51, 6846–6892. doi: 10.1002/2015WR017609
- Cole, I. S., Corrigan, P., Sim, S., and Birbilis, N. (2011). Corrosion of pipelines used for CO₂ transport in CCS: is it a real problem? *Int. J. Greenhouse Gas Control* 5, 749–756. doi: 10.1016/j.ijggc.2011.05.010
- Davidson, C. L., Dahowski, R. T., McJeon, H. C., Clarke, L. E., Iyer, G. C., and Muratori, M. (2017). The value of CCS under current

target by 2100, particularly relevant after the Paris agreement in 2015. The results show that carbon leakage can lead to up to 25 GtCO₂ of additional emissions throughout the twenty-first century for a leakage rate of 0.1% per year, which represents about 3% of total captured emissions. Considering a more optimistic leakage rate (0.01%), only 0.5% of injected emissions would leak by 2100. If accounted for in the carbon budget and priced, CCS deployment is expected to be lowered by up to 35% (fossil) and 10% (BECCS) for high leakage rates. This means that CCS remains an important technology for mitigation in the power sector, notably coal and gas based in less stringent scenarios, and biomass fueled for the 1.5°C scenario. Due to more early-on abatement, considering leakage leads to slightly lower global warming in the long run. If not taken into consideration nor priced, on the other hand, it leads to an around 0.01–0.02 degrees higher global mean temperature. Overall, policy costs increase by about 0.2–0.4 percentage points (of GDP loss) due to considered leakage. In terms of regional distribution, China, Latin America, the U.S., and Canada have the highest leakage amount to be expected by 2100. The associated economic value of this quantity ranges across regions from 70 to more than 200 billion USD. Finally, we demonstrated how appropriate monitoring and accounting of leakage imply a reduction in use of CCS and also economic saving for most countries.

AUTHOR CONTRIBUTIONS

AV contributed to developing the idea, methodology, model design and execution, writing and revising the manuscript; JE contributed to developing the idea and methodology, supervised model design and execution, writing and revising the manuscript; MT have supervised the work, providing suggestions on the research scope and revisions.

policy scenarios: NDCs and beyond. *Energy Procedia* 114, 7521–7527. doi: 10.1016/j.egypro.2017.03.1885

- Deng, H., Bielicki, J. M., Oppenheimer, M., Fitts, J. P., and Peters, C. A. (2017). Leakage risks of geologic CO₂ storage and the impacts on the global energy system and climate change mitigation. *Clim. Change* 144, 151–163. doi: 10.1007/s10584-017-2035-8
- Dethlefsen, F., Köber, R., Schäfer, D., Hagrey, S. A. A., Hornbruch, G., Ebert, M., et al. (2013). Monitoring approaches for detecting and evaluating CO₂ and formation water leakages into near-surface aquifers. *Energy Procedia* 37(Suppl. C), 4886–4893. doi: 10.1016/j.egypro.2013.06.399
- Dooley, J. J. (2013). Estimating the supply and demand for deep geologic CO₂ storage capacity over the course of the 21st century: a meta-analysis of the literature. *Energy Procedia* 37, 5141–5150. doi: 10.1016/j.egypro.2013.06.429
- Edenhofer, O., Pichs-Madruga, R., Sokona, Y., Farahani, E., Kadner, S., Seyboth, K., et al. (2014). *Climate Change 2014: Mitigation of Climate Change: Contribution of Working Group iii to the Fifth Assessment Report of the Intergovernmental Panel on Climate Change*. Cambridge, UK; New York, NY: Cambridge University Press..
- Emmerling, J., Drouet, L., Reis, L. A., Bevione, M., Berger, L., Bosetti, V., et al. (2016). "The WITCH 2016 Model-Documentation and Implementation of the Shared Socioeconomic Pathways," in *Working Paper 2016.42*. Milan: Fondazione Eni Enrico Mattei.
- Etheridge, D., Luhar, A., Loh, Z., Leuning, R., Spencer, D., Steele, P., et al. (2011). Atmospheric monitoring of the CO₂crc Otway project and

- lessons for large scale CO₂ storage projects. *Energy Procedia* 4, 3666–3675. doi: 10.1016/j.egypro.2011.02.298
- EU, C. (2009). *Directive 2009/31/EC of the European Parliament and of the Council of 23 April 2009 on the geological storage of carbon dioxide and amending Council Directive 85/337/EEC, European Parliament and Council Directives 2000/60/EC, 2001/80/EC, 2004/35/EC, 2006/12/EC, 2008/1/EC and Regulation (EC) No 1013/2006*. Technical report, European Union.
- Finkenrath, M. (2011). “Cost and performance of carbon dioxide capture from power generation,” in *IEA Energy Papers 2011/5*. Paris: International Energy Agency.
- Gale, J. J. (2004). Using coal seams for CO₂ sequestration. *Geol. Belgica* 7, 99–103. Available online at: <https://popups.uliege.be/443/1374-8505/index.php?id=239>
- GCCSI (2011). *Accelerating the Uptake of CCS: Industrial use of Captured Carbon Dioxide*. Technical report, Global Carbon Capture and Storage Institute.
- GCCSI (2014). *What Happens When CO₂ is Stored Underground? q&a From the IEAGHG Weyburn-Midale CO₂ Monitoring and Storage Project*. Technical report, Global CCS Institute (Docklands, VIC).
- GCCSI (2016). *The Global Status of CCS 2016: Summary Report*. Technical report, Global Carbon Capture and Storage Institute.
- Godec, M., Kuuskraa, V., Van Leeuwen, T., Stephen Melzer, L., and Wildgust, N. (2011). CO₂ storage in depleted oil fields: the worldwide potential for carbon dioxide enhanced oil recovery. *Energy Procedia* 4, 2162–2169. doi: 10.1016/j.egypro.2011.02.102
- Hendriks, C., Graus, W., and van Bergen, F. (2004). *Global Carbon Dioxide Storage Potential and Costs*. Technical report, Ecofys.
- IEA (2008). *CO₂ Capture and Storage: A Key Carbon Abatement Option*. Technical report, International Energy Agency (Paris).
- IEA (2015). *Insight Publications: Storing CO₂ Through Enhanced Oil Recovery*. Technical report, International Energy Agency (Paris).
- IEA (2016). *20 Years of Carbon Capture and Storage-Accelerating Future Deployment*. Technical report, International Energy Agency (Paris).
- IEA-ETSAP (2010). *CO₂ Capture and Storage*. Technical report, IEA Energy Technology Systems Analysis (Paris).
- IEAGHG (2008). *Aquifer Storage: Development Issues*. Canberra: IEA Greenhouse Gas R&D Programme. Available online at: <http://www.globalccsinstitute.com/publications/aquifer-storage-development-issues>
- IEAGHG (2011). *Potential for Biomass and Carbon Dioxide Capture and Storage*. Technical report, IEA Greenhouse Gas R&D Programme (Cheltenham). Canberra. Available online at: <http://www.globalccsinstitute.com/publications/aquifer-storage-development-issues>
- IEAGHG (2016). Can CO₂ capture and storage unlock ‘unburneable carbon’? Technical report, IEA Greenhouse Gas R&D Programme, (Cheltenham).
- Imbus, S. W., Dodds, K., Otto, C. J., Trautz, R. C., Christopher, C. A., Agarwal, A., et al. (2013). CO₂ storage contingencies initiative: detection, intervention and remediation of unexpected CO₂ migration. *Energy Procedia* 37(Suppl. C), 7802–7814. doi: 10.1016/j.egypro.2013.06.343
- IPCC (2014). *CLIMATE CHANGE 2014 Mitigation of Climate Change*. Technical report, Intergovernmental Panel on Climate Change.
- Jones, D. G., Barlow, T., Beaubien, S. E., Ciotoli, G., Lister, T. R., Lombardi, S., et al. (2009). New and established techniques for surface gas monitoring at onshore CO₂ storage sites. *Energy Procedia* 1, 2127–2134. doi: 10.1016/j.egypro.2009.01.277
- Koelbl, B. S., van den Broek, M., van Ruijven, B., Faaij, A. P. C., and van Vuuren, D. P. (2014). Uncertainty in the deployment of Carbon Capture and Storage (CCS): a sensitivity analysis to techno-economic parameter uncertainty. *Int. J. Greenhouse Gas Control* 27, 81–102. doi: 10.1016/j.ijggc.2014.04.024
- Koelbl, B. S., van den Broek, M., van Ruijven, B., van Vuuren, D. P., and Faaij, A. P. C. (2013). A sensitivity analysis of the global deployment of CCS to the cost of storage and storage capacity estimates. *Energy Procedia* 37, 7537–7544. doi: 10.1016/j.egypro.2013.06.697
- Lackner, K. S., and Brennan, S. (2009). Envisioning carbon capture and storage: expanded possibilities due to air capture, leakage insurance, and C-14 monitoring. *Clim. Change* 96, 357–378. doi: 10.1007/s10584-009-9632-0
- Lipponen, J., McCulloch, S., Keeling, S., Stanley, T., Berghout, N., and Berly, T. (2017). The politics of large-scale CCS deployment. *Energy Procedia* 114, 7581–7595. doi: 10.1016/j.egypro.2017.03.1890
- Little, M. G., and Jackson, R. B. (2010). Potential impacts of leakage from deep CO₂ geosequestration on overlying freshwater aquifers. *Environ. Sci. Technol.* 44, 9225–9232. doi: 10.1021/es102235w
- Liu, L.-C., Li, Q., Zhang, J.-T., and Cao, D. (2016). Toward a framework of environmental risk management for CO₂ geological storage in china: gaps and suggestions for future regulations. *Mitigat. Adapt. Strateg. Global Change* 21, 191–207. doi: 10.1007/s11027-014-9589-9
- McCoy, S. T., and Rubin, E. S. (2008). An engineering-economic model of pipeline transport of CO₂ with application to carbon capture and storage. *Int. J. Greenhouse Gas Control* 2, 219–229. doi: 10.1016/S1750-5836(07)00119-3
- Metz, B., Davidson, O., de Coninck, H., Loos, M., and Meyer, L. (2005). *IPCC-Carbon Dioxide Capture and Storage (SRCCS)*. Technical report, Intergovernmental Panel on Climate Change.
- NAS (2015). *Climate Intervention: Carbon Dioxide Removal and Reliable Sequestration*. Technical report, National Research Council (U.S.), National Academies Press.
- Rogelj, J., Luderer, G., Pietzcker, R. C., Kriegl, E., Schaeffer, M., Krey, V., et al. (2015). Energy system transformations for limiting end-of-century warming to below 1.5°C. *Nat. Clim. Change* 5, 519–527. doi: 10.1038/nclimate2572
- Romanak, K. D., Bennett, P. C., Yang, C., and Hovorka, S. D. (2012). Process-based approach to CO₂ leakage detection by vadose zone gas monitoring at geologic CO₂ storage sites. *Geophys. Res. Lett.* 39:L15405. doi: 10.1029/2012GL052426
- Romanov, V., Soong, Y., Carney, C., Rush, G. E., Nielsen, B., and O’Connor, W. (2015). Mineralization of carbon dioxide: a literature review. *ChemBioEng Rev.* 2, 231–256. doi: 10.1002/cben.201500002
- Rubin, E. S., Davison, J. E., and Herzog, H. J. (2015). The cost of CO₂ capture and storage. *Int. J. Greenhouse Gas Control* 40, 378–400. doi: 10.1016/j.ijggc.2015.05.018
- Sanna, A., Uibu, M., Caramanna, G., Kuusik, R., and Maroto-Valer, M. (2014). A review of mineral carbonation technologies to sequester CO₂. *Chem. Soc. Rev.* 43, 8049–8080. doi: 10.1039/C4CS00035H
- van der Zwaan, B., and Gerlagh, R. (2009a). Economics of geological CO₂ storage and leakage. *Clim. Change* 93, 285–309. doi: 10.1007/s10584-009-9558-6
- van der Zwaan, B., and Gerlagh, R. (2009b). Effectiveness of CCS with time-dependent CO₂ leakage. *Energy Procedia* 1, 4977–4984. doi: 10.1016/j.egypro.2009.05.002
- van der Zwaan, B., and Smekens, K. (2009). CO₂ capture and storage with leakage in an energy-climate model. *Environ. Model. Assess.* 14, 135–148. doi: 10.1007/s10666-007-9125-3
- Vuuren, D. P. v., Hof, A., Gernaat, D., and de Boer, H. S. (2017). *Limiting Global Temperature Change to 1.5°C*. PBL Netherlands Environmental Assessment Agency Report.
- Wilson, E. J., Johnson, T. L., and Keith, D. W. (2003). Regulating the ultimate sink: managing the risks of geologic CO₂ storage. *Environ. Sci. Technol.* 37, 3476–3483. doi: 10.1021/es021038+
- ZEP (2011). *The Costs of CO₂ Capture, Transport and Storage*. Technical report, European Technology Platform for Zero Emission Fossil Fuel Power Plants (Brussels).

Conflict of Interest Statement: The authors declare that the research was conducted in the absence of any commercial or financial relationships that could be construed as a potential conflict of interest.

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