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#### **LETTER**

# The role of enhanced rock weathering deployment with agriculture in limiting future warming and protecting coral reefs

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#### **Abstract**

Meeting the net-zero carbon emissions commitments of major economies by mid-century requires large-scale deployment of negative emission technologies (NETs). Terrestrial enhanced rock weathering on croplands (ERW) is a NET with co-benefits for agriculture, soils and ocean acidification that creates opportunities for generating income unaffected by diminishing carbon taxes as emissions approach net-zero. Here we show that ERW deployment with croplands to deliver net 2 Gt CO<sub>2</sub> yr<sup>-1</sup> removal approximately doubles the probability of meeting the Paris 1.5 °C target at 2100 from 23% to 42% in a high mitigation Representative Concentration Pathway 2.6 baseline climate. Carbon removal via carbon capture and storage (CCS) at the same rate had an equivalent effect. Co-deployment of ERW and CCS tripled the chances of meeting a 1.5 °C target (from 23% to 67%), and may be sufficient to reverse about one third of the surface ocean acidification effect caused by increases in atmospheric CO<sub>2</sub> over the past 200 years. ERW increased the percentage of coral reefs above an aragonite saturation threshold of 3.5 from 16% to 39% at 2100, higher than CCS, highlighting a co-benefit for marine calcifying ecosystems. However, the degree of ocean state recovery in our simulations is highly uncertain and ERW deployment cannot substitute for near-term rapid CO<sub>2</sub> emissions reductions.

### 1. Introduction

A rapid transition to a low-carbon economy is essential to avoid breaching the Paris Agreement climate targets. However, this transition is insufficient to meet the mid-century net-zero carbon emission commitments of major economies, including the UK, EU, China and Japan, without large-scale deployment of negative emission technologies (NETs) (Hartmann et al 2013, Board and Council 2015). It is generally assumed that NET deployment will be funded by redistribution of income from local or global carbon taxation (Honegger and Reiner 2018, Bednar et al 2019), but this income source will diminish as emissions, and resulting carbon-tax receipts, reduce with the transition to clean energy advances. Hence, the deployment of NETs with cobenefits impacting multiple economic sectors could

provide valuable opportunities to incentivise continued active carbon drawdown. Such efforts might then allow existing regulation and incentive schemes to be re-purposed and strengthened to encourage carbon sequestration without direct reliance on carbon pricing (Cox and Edwards 2019). Furthermore, the repurposing of existing policy frameworks may facilitate an earlier introduction of negative emissions, potentially another critical enabling factor in the ultimate achievement of ambitious mitigation targets.

Terrestrial enhanced rock weathering (ERW) is a NET removing atmospheric CO<sub>2</sub> by accelerating natural chemical breakdown of silicate rocks, ultimately locking the carbon in ocean, sediments and soils. ERW releases base cations (primarily Ca<sup>2+</sup> and Mg<sup>2+</sup>) and delivers alkalinity (HCO<sub>3</sub><sup>-</sup> and CO<sub>3</sub><sup>2-</sup>) via runoff to the river systems and ultimately to the ocean. The residence time of these anions in the

global ocean is on the order of 100000–1000000 years, making it a permanent carbon storage reservoir on human timescales (Renforth and Henderson 2017, Beerling *et al* 2018). In soil, the precipitation of secondary carbonate minerals from the release of base cations can create another sink for CO<sub>2</sub>, if soil pore water is supersaturated with respect to carbonate minerals (Manning and Renforth 2013). ERW may have utility in decarbonisation scenarios required for net-zero because of its potential cobenefits for agriculture and marine sectors, including crop yield enhancement and mitigation of both terrestrial N<sub>2</sub>O emissions and ocean acidification (Köhler *et al* 2010, Hartmann *et al* 2013, Taylor *et al* 2016, Beerling *et al* 2018, Kelland *et al* 2020).

Here, we evaluate the effects of an optimised, multi-national strategy designed to achieve a net carbon dioxide removal (CDR) goal of 2 Gt CO<sub>2</sub> yr<sup>-1</sup> via ERW deployment with croplands (Beerling et al 2020) using an intermediate complexity Earth system model, the grid-enabled integrated Earth system model (GENIE) (Holden et al 2013a). The net CDR goal of 2 Gt CO2 yr-1 accounts for secondary CO<sub>2</sub> emissions from logistical ERW supply chain operations (mining, grinding, transporting and spreading) and constraints on energy availability for rock grinding (Beerling et al 2020). It is lower than earlier detailed theoretical assessments of the effect of widespread ERW application on tropical ecosystems, which neglected practical constraints related to energy cost, safety and conservation (Taylor et al 2016, Strefler et al 2018).

Building on prior Earth system assessments of tropical forest ERW deployment (Köhler et al 2010, 2013, Taylor et al 2016), we focus on global atmospheric CO<sub>2</sub>, climate and ocean biogeochemistry feedbacks of cropland ERW over the coming century. Our analysis considers undertaking ERW practices in the context of the Intergovernmental Panel on Climate Change's (IPCC) high mitigation scenario, Representative Concentration Pathway (RCP) 2.6 (van Vuuren et al 2011). Assessing ERW effectiveness with RCP2.6 allows examination of the effects of additional NET deployment within a scenario that assumes existing international cooperation for mitigating CO<sub>2</sub> through climate policies. Furthermore, we compared Earth system responses to ERW with carbon capture and storage (CCS) NET of an equivalent annual CO<sub>2</sub> drawdown, and co-deployment of ERW and CCS strategies to examine potential interactions on CDR efficacy.

Biogeochemical feedbacks assessed include changes in CO<sub>2</sub> concentration, mean global warming, surface ocean pH and ocean aragonite saturation state, a key variable affecting coral reef health (Mollica *et al* 2018). To quantify uncertainty, we used an 86-member ensemble with GENIE, pre-calibrated to satisfy large-scale constraints on the preindustrial state (Holden *et al* 2013b) and historical transient

warming and carbon sinks (Holden et al 2013a, Foley et al 2016).

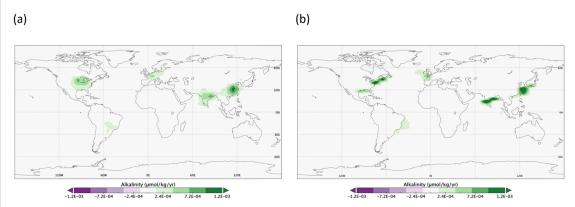
### 2. Methods

#### 2.1. GENIE model simulations

We developed three GENIE simulation experiments adopting a high mitigation baseline (RCP2.6, the postscript 2.6 denoting radiative forcing in Wm<sup>-2</sup> in year 2100 relative to year 1750): (a) ERW with 2 Gt  $CO_2$  yr<sup>-1</sup> removal, (b) CCS with 2 Gt  $CO_2$  yr<sup>-1</sup> removal, (c) co-deployment of ERW with CCS giving a total of 4 Gt CO<sub>2</sub> yr<sup>-1</sup> removal. GENIE version 2.7.7 (Holden et al 2013a, 2013b) consists of seven main modules for studying Earth system dynamics and making long-term future predictions. The physical model is the combination of a 3D frictional geostrophic ocean model (GOLD-STEIN) (at 36 × 36 grid-cells horizontal resolution with 16 vertical levels), a 2D energy moisture balance model of the atmosphere and a thermodynamic/dynamic sea-ice model. The land surface carbon storage is modelled with the efficient numerical terrestrial scheme. The rock-weathering module ROKGEM (Colbourn et al 2013) is included to redistribute prescribed weathering fluxes according to a fixed river-routing scheme. The potentially beneficial effect of ERW on marine ecosystems via enhanced nutrient fluxes from terrestrial to ocean components was not considered in the analysis.

The ocean biochemistry model (BIOGEM) (Ridgwell *et al* 2007) includes cycling of iron based on Annan and Hargreaves (2010) for estimation of the changes in phosphate and dissolved organic phosphorous concentrations. The deep-sea sediment module (SEDGEM) (at a  $36 \times 36$  resolution) is based on the cycling of carbon and alkalinity together with the essential nutrients, phosphate, silicic acid and iron (Ridgwell 2001, Ridgwell and Hargreaves 2007).

For each model experiment, GENIE was run for an ensemble of 86 different parameter sets to capture a wide range of possible climate responses. Each ensemble member employs a different combination of 28 parameters filtered from a wide range of plausible input values. The filtering process uses emulation of input parameter space to produce reasonable preindustrial climates (Holden et al 2013a) and through transient simulations with historical forcing from AD 850 including land use change to give plausible climate-change responses (Holden et al 2013b, Foley et al 2016). The future NET scenarios (beginning at 2020) were based on RCP2.6 GENIE settings (Zickfeld et al 2013) for the period of 80 years till the end of the century. The carbon cycle effects of ERW and CCS are both modelled as a reduction in anthropogenic CO<sub>2</sub> emissions. In the case of ERW, approximately 2/3 of this carbon is returned to the system through a bicarbonate flux to the ocean with the remainder, representing pedogenic carbon, removed



**Figure 1.** Average annual alkalinity fluxes from croplands calculated with a global model of ERW (Beerling *et al* 2020) re-gridded to the GENIE (an Earth system model) grid resolution: (a) on land and (b) at the point of entering the ocean.

permanently (see following section 2.2 for details). For each NET scenario, the likelihood of meeting the Paris agreement temperature targets was estimated as the percentage of the ensemble members with peak and 2100 warming below the relevant thresholds.

#### 2.2. Alkalinity flux data

The impact of ERW-induced alkalinity fluxes on the Earth system was investigated by introducing decadal average bicarbonate fluxes calculated with a global ERW model based on a model of rock weathering within the soil profile (Beerling et al 2020) as an input to GENIE. The ERW model uses an optimisation procedure accounting for environmental conditions, available energy for rock dust grinding and transportation costs to determine regions most suitable for ERW on a nation-by-nation basis. We assumed a 2:1 partitioning of a global net 2 Gt CO<sub>2</sub> yr<sup>-1</sup> CDR between an alkalinity flux of 1.3 Gt CO<sub>2</sub> yr<sup>-1</sup> delivered into the oceans and 0.7 Gt CO<sub>2</sub> yr<sup>-1</sup> sequestered via soil carbonate formation, as determined by the ERW modelling (Beerling et al 2020). Average annual alkalinity fluxes were re-gridded to the GENIE grid resolution  $(10^{\circ} \times (3-19)^{\circ}$  equal area cells) (figure 1(a)) and runoff from coastal cells to the ocean determined by the runoff scheme in GENIE (Edwards and Marsh 2005) (figure 1(b)).

This idealized analysis assumes a constant ERW derived alkalinity flux for 2020–2100, and the same procedure is used in the ERW and CCS codeployment simulations. A preliminary estimation of the significance of the effect of climate change on CDR with ERW was conducted offline using the GENIE natural weathering module ROKGEM (Colbourn *et al* 2013). The module was first forced with ensemble averaged fields of surface air temperature:

$$F_{\text{CaSiO}_3} = F_{\text{CaSiO}_3,0} e^{-\frac{E_a}{R} \left(\frac{1}{T} - \frac{1}{T_0}\right)}$$
 (1)

where  $F_{\text{CaSiO}_3}$  is the alkalinity flux (mol yr<sup>-1</sup>),  $E_a$  is the activation energy for dissolution (63 kJ mol<sup>-1</sup>)

(Brady 1991), T is spatial temperature (K) and R is the molar gas constant (8.31 J K<sup>-1</sup> mol<sup>-1</sup>) (Colbourn *et al* 2013). The index zero stands for the initial value

The alkalinity flux was then modified ( $F_{CaSiO_3,m}$ ) to include the terrestrial gross primary productivity and runoff feedbacks under RCP2.6:

$$F_{\text{CaSiO}_3,\text{m}} = F_{\text{CaSiO}_3} \left(\frac{P}{P_0}\right) \left(1 + k_{\text{run}} \left(T_{\text{g}} - T_{\text{g,0}}\right)\right)^{\beta}$$
(2)

where P is the spatial productivity (kgC m<sup>-2</sup> yr<sup>-1</sup>),  $T_g$  is the global temperature (K) and  $k_{\text{run}}$  (K<sup>-1</sup>) and  $\beta$  are global runoff constants set to 0.25 (New *et al* 1999, Fekete *et al* 2000, 2002) and 0.8 (West *et al* 2005), respectively. The index zero denotes the initial value.

# 2.3. ERW mitigation of agricultural N2O

In GENIE, a globally uniform perturbation to the radiative forcing is applied to account for unmodelled forcing agents such as non-CO2 trace gases. The climatic effect of reduced agricultural N<sub>2</sub>O emissions resulting from ERW practices uses this approach, deriving the radiative forcing in a two-stage process. We first estimate agricultural N<sub>2</sub>O emissions by projecting 2010–2030 estimates (Reay et al 2012) and assume a 40% reduction from these (Blanc-Betes et al 2021), resulting in around 4.4 Tg N<sub>2</sub>O yr<sup>-1</sup> emissions reduction from 20% of the global cropland regions treated with ERW. The total cropland area of 2.96 Mkm<sup>2</sup> was estimated based on the net 2 Gt CO2 yr-1 CDR scenario in (Beerling et al 2020) which considers ERW deployment on the percentage of agricultural lands of China (55%), USA (55%), India (51%), Brazil (51%), Indonesia (59%), Canada (35%), Mexico (52%) and the European nations, France (54%), Germany (57%), Italy (55%), Spain (41%) and Poland (38%). We recognize that reductions in N2O with ERW treatment using basalt need evaluation across a wider range of crop and soil types, and climates, but developed this model experiment as a first test to estimate an upper bound of ERW N2O mitigation effects on climate. The estimated  $N_2O$  emission reductions are then converted to equivalent  $CO_2$  (based on the greenhouse gas global warming potential over 100 years (GWP-100) (IPCC 2001)) and subtracted from global  $CO_2$  emissions through time in a sensitivity experiment. A radiative forcing time series was then diagnosed from the perturbed  $CO_2$  concentration using (IPCC 2001):

$$\Delta F(t) = \alpha \ln \left( \frac{C^{N}(t)}{C(t)} \right)$$
 (3)

where  $\Delta F(t)$  is the radiative forcing due to  $\mathrm{CO}_2$  concentration (Wm<sup>-2</sup>) at time t,  $\alpha$  is a constant equal to 5.35 Wm<sup>-2</sup>,  $C^N(t)$  is the atmospheric  $\mathrm{CO}_2$  concentration (ppm) in the N<sub>2</sub>O forced experiment, C(t) atmospheric  $\mathrm{CO}_2$  concentration (ppm) in the baseline. The non- $\mathrm{CO}_2$  trace gas radiative forcing was adjusted by  $\Delta F(t)$  in the ERW and co-deployment simulations.

# 2.4. Sensitivity of the coral reefs to the ocean acidification

We investigated the ocean biogeochemical implications of each scenario (ERW, CCS, and ERW with CCS) for coral reef oceanic environments by calculating changes in pH and the aragonite saturation state ( $\Omega_{\rm arg}$ ) of surrounding waters derived from GENIE simulations. Saturation state  $\Omega_{\rm arg}$  is defined as (Zeebe and Wolf-Gladrow 2001, Ridgwell *et al* 2007, Gattuso and Hansson 2011):

$$\Omega_{\rm arg} = \frac{\left[ \text{Ca}^{2+} \right] \left[ \text{CO}_3^{2-} \right]}{K_{\rm SD}}.\tag{4}$$

Where  $[Ca^{2+}]$  and  $[CO_3^{2-}]$  are the concentrations of calcium and carbonate ions in terms of mol  $kg^{-1}$ , respectively.  $K_{\rm sp}$  is a solubility constant mol<sup>2</sup> kg<sup>-2</sup> calculated from the empirical formula in (Millero 1995) and varies with temperature and salinity. We used three different  $\Omega_{arg}$  thresholds (3, 3.25 and 3.5) for each scenario, given that the critical threshold varies across different coral populations (Kleypas 1999, Guinotte et al 2003, Ricke et al 2013). Reef locations were extracted from Reef Base Global Database (Tupper et al 2011) (supplementary material figure S1 (available online at stacks.iop.org/ERL/16/ 094005/mmedia)) and the data re-gridded to GENIE grid resolution. For each grid cell containing reefs, the associated  $\Omega_{arg}$  value was assigned and compared with the defined critical aragonite saturation to determine the percentage of reef locations surrounded by supersaturated waters.

#### 3. Results

# 3.1. NETs help achieve the 1.5 $^{\circ}\mathrm{C}$ Paris agreement target

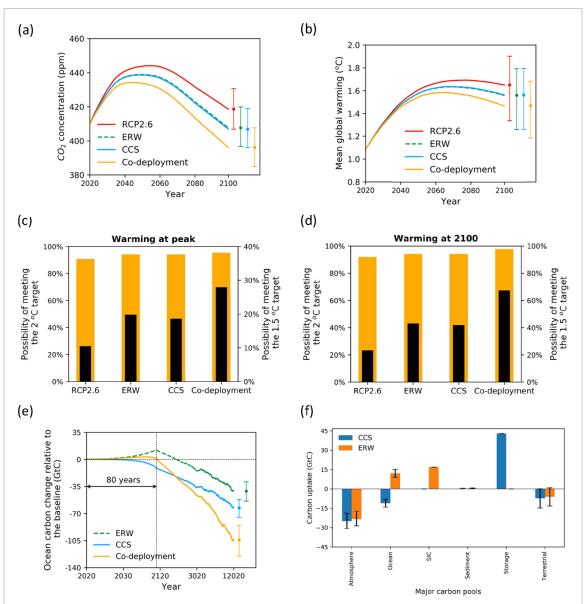
According to our Earth system simulations, application of either NET (ERW or CCS) slowed

the atmospheric  $CO_2$  growth rate and lowered peak atmospheric  $CO_2$  concentrations by  $\sim$ 6 ppm at 2050 and 11 ppm at 2100 (figure 2(a)). These results are approximately a quarter of the end-of-century atmospheric  $CO_2$  reduction by ERW ( $\sim$ 40 ppm) reported previously (Taylor *et al* 2016). However, those results were based on the hypothetical case of distributing crushed basalt (1 kg m $^{-2}$  yr $^{-1}$ ) over a large area of tropical forests (20 million km $^2$ ) under RCP4.5 (Taylor *et al* 2016). Co-deployment of both NETs in our simulations doubled the end-of-century  $CO_2$  reduction to 23 ppm (figure 2(a)) indicating their additive effects on net carbon drawdown without adverse carbon cycle interactions.

Global temperature responded to reduced radiative forcing from lowered atmospheric CO2 concentrations with both ERW and CCS reducing mean global warming by 0.06 °C at peak warming in 2076, and 0.1 °C at 2100 (figure 2(b)). These temperature reductions approximately doubled the probability of meeting the 1.5 °C target from 10% to 19% at peak and from 23% to 42% at 2100, compared to the baseline (figures 2(c) and (d)). Co-deployment of both NETs increased the probability of meeting this target three-fold, from 23% to 67% at 2100 (figure 2(d)). For the 2 °C target, already likely in RCP2.6, deployment of both ERW and CCS resulted in small reductions in the probability of exceeding 2 °C peak warming (nonexceedance probability increased from 91% to 95% at peak) and reduced this risk in 2100 by threequarters (92%-98%) (figures 2(c) and (d)). Potential reductions in agricultural N2O emissions by ERW decreased mean global temperature by about 0.01 °C in 2100, indicating the effect is approximately a tenth as important as atmospheric CO<sub>2</sub> reductions.

Global carbon cycle dynamical responses differed between NETs on a century timescale. Over the 21st century, ERW removed atmospheric CO<sub>2</sub> and transferred it to the ocean via the addition of alkalinity (green line, figure 2(e)). The removal is not 1:1 because of ocean CO<sub>2</sub> outgassing offsetting artificial drawdown (Hansen *et al* 2013, Taylor *et al* 2016). With CCS deployment, carbon loss from the atmosphere via its direct injection into permanent geological reservoirs leads to ocean carbon loss via outgassing as surface waters equilibrate with the lower atmospheric CO<sub>2</sub> concentration (blue line, figure 2(e)). End-of-century partitioning between the major global carbon cycle reservoirs illustrates these contrasting responses (figure 2(f)).

We extended these global carbon cycle analyses to assess the long-term fate of CO<sub>2</sub> removed by ERW using 10000 year continuous simulations with fully interactive carbon dynamics in the land, ocean and sediment reservoirs (figure 2(e)). Over multi-millennial (10000 year) timescales, carbon storage in the oceans slowly decreased and storage in the ocean sediments (carbonates) and other



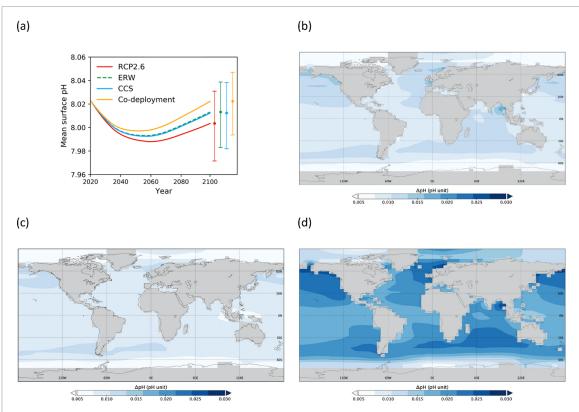
**Figure 2.** NETs permanently mitigate atmospheric CO<sub>2</sub> concentration and reduce the temperature in RCP2.6 climate change projection (mean values). (a) Atmospheric CO<sub>2</sub> concentration, (b) mean global warming, (c) and (d) the probability of meeting the Paris agreement 1.5° (black) and 2° (orange) warming targets. (e) Variation in the ocean carbon storage relative to the baseline over 10000 years (begins from 2020). Note the logarithmic scale on the *x* axis. (f) Changes in carbon inventories in ERW and CCS scenarios at 2100 with respect to 2020 compared to the baseline (RCP2.6). The 10%–90% confidence interval for each carbon sink is given by an error bar. Note that the values of soil inorganic carbon and storage are calculated directly from the model inputs and do not include uncertainty. In (a), (b) and (e) the 10%–90% confidence interval for each scenario is given by an error bar for the last year, baseline (red), ERW (green), CCS (blue) and co-deployment (orange).

reservoirs increased as the global carbon cycle reequilibrated (supplementary material figure S2). Differences between three model experiments were maintained consistently over this 10000 year interval (EW, CCS and EW with CCS). Given that carbon is permanently removed from the system in our experimental design in the CCS case, a temporally consistent long-term offset supports carbon removal by ERW as being effectively 'permanent'. These results provide support for prior assumptions regarding the storage security of carbon by removal via ERW derived alkalinity (Renforth and Henderson 2017, The Royal Society and Royal Academy of Engineering 2018) (figure 2(e)).

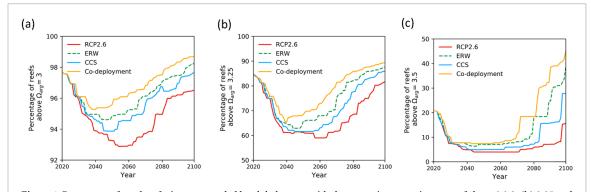
# 3.2. The effect of NETs on ocean acidification and marine organisms

Based on the metric of global mean surface ocean pH, both ERW and CCS were equally effective at reducing ocean acidification, increasing it by  $\sim$ 0.01 units by end-of-century relative to the baseline (figure 3(a)). Co-deployment of ERW and CCS doubled this effect mitigating ocean acidification by a global average of 0.02 units, so that by the end of the century, the strategy of co-deployment returned mean ocean pH close to 2020 levels (figure 3(a)).

As expected, the spatial distribution of increased surface ocean pH in ERW and CCS differs (figures 3(b) and (c)). Results for ERW reveal a strong



**Figure 3.** The impact of NETs on the surface ocean pH. (a) Mean surface ocean pH. The 10%–90% confidence interval at 2100 is given by an error bar for each scenario, baseline (RCP2.6) (red), ERW (green), CCS (blue) and co-deployment (orange); (b) the spatial distribution of increased pH in ERW, (c) CCS and (d) co-deployment scenarios relative to the baseline at 2100.



**Figure 4.** Percentage of coral reefs sites surrounded by global waters with the aragonite saturation state of above (a) 3, (b) 3.25 and (c) 3.5 as a function of time (median values). Note the different scaling of the *y*-axis in each critical aragonite saturation threshold  $(\Omega_{arg})$ .

signal in south Asia where extensive deployment on croplands produces an alkalinity flux delivered to the surface ocean in the outflows of the major rivers (figure 3(b)). In the CCS scenario, increases in ocean pH are distributed evenly over the ocean surface as a result of global atmospheric CO<sub>2</sub> removal rather than localized delivery of alkalinity (figure 3(c)). Co-deployment of ERW and CCS drives regional increases in surface ocean pH with marked hotpot regions in the Southern Ocean and Eastern Pacific of 0.03 pH units (figure 3(d)). These responses suggest our co-deployment scenario may be sufficient to reverse about one third of the surface ocean acidification effect caused by increases in atmospheric CO<sub>2</sub>

since the industrial revolution (0.1 units) (Doney et al 2020, Su et al 2020).

Coral reefs shift from carbonate accretion towards dissolution where the open ocean  $\Omega_{\rm arg}$  values fall below a critical threshold due to ocean acidification (Andersson and Gledhill 2013, Fabry *et al* 2008, Gattuso and Hansson 2011, Albright *et al* 2016). We therefore analysed how changes in ocean acidification with NET deployment for atmospheric CO<sub>2</sub> drawdown affected  $\Omega_{\rm arg}$  in relation to the geographical distribution of coral reefs (figure 4).

In RCP2.6 without additional NET deployment, the percentage of coral reefs above aragonite saturation thresholds of 3, 3.25 and 3.5 decreases from

2020 to 2050, and from that minimum then begins to increase towards the end of the century as atmospheric  $CO_2$  levels decline (figure 4). ERW and CCS deployment increases the percentage of coral reefs above each of the three  $\Omega_{arg}$  thresholds from 2050 onwards. ERW raised the end-of-century  $\Omega_{arg}$  state more than CCS in all simulation due to changes in atmospheric  $CO_2$  combined with ERW produced alkalinity flux to the ocean. The magnitude of the protective effects increased with higher  $\Omega_{arg}$  values. For the highest threshold case (3.5), where the differences between NETs is most marked, we find RCP2.6 leaves 84% of reefs vulnerable to dissolution in 2100 whereas ERW protects  $\sim$ 39% of reefs, CCS  $\sim$ 28% and ERW with CCS  $\sim$ 45%.

#### 4. Discussion

Action on climate change requires atmospheric CO<sub>2</sub> removal with a suite of NETs (IPCC 2018, The Royal Society and Royal Academy of Engineering 2018), while urgently phasing down fossil fuel CO2 emissions in the near term remains the highest priority for mitigation policies (Hansen et al 2017). This necessitates understanding the effectiveness of NETs deployment both individually and when co-deployed with each other. We have addressed this critically important but understudied aspect of climate change science with intermediate complexity Earth system model simulations of ERW and CCS by a NET, such as direct air capture or bioenergy with CCS. Our analyses highlight that for these two NETs there are no adverse interactions, with the effects on CO<sub>2</sub> removal being simply additive. However, we show that co-benefits for calcifying marine organisms are greater for ERW, which is effectively a form of ocean alkalinisation (Bach et al 2019).

Deployment of NETs is unlikely to happen without new policy frameworks or specific enabling reforms (Bellamy et al 2021). At present, suitable policies are lacking in spite of the need to reach 100-1000 Gt CO<sub>2</sub> levels of drawdown by 2100 (IPCC 2018). The expectation remains that the costs of CDR would ultimately be balanced by compensating income from carbon tax receipts. However, this source is unlikely to be sufficient in the early stages of development in the 2020s (CCC 2020) and from the 2040s will again collapse to the least amenable sectors to decarbonisation, such as aviation and agriculture, as emissions approach net zero, thus again requiring support to avoid high taxation rates. Furthermore, explicit separation of emission reduction and carbon removal targets is likely to be key to avoiding the perception of CDR as mitigation avoidance (Bellamy et al 2021). In this context, although the overall costs of CDR, at least in the UK, are within the scale of existing renewables support (CCC 2020),

incentivisation policies based on co-benefits offer an attractive option. Importantly, as well as being associated with existing funding streams, policies around co-benefits may reduce delays in deployment. Given farming is heavily subsidised in most countries, this may be the most practical option to support CDR through ERW in the near term at least (Cox and Edwards 2019). In the USA, farmer subsidies for actions enhancing soil carbon storage are already possible, while the European Commission has proposed the use of funds from the common agriculture policy (CAP) to incentivise CDR by farmers via the farm to fork strategy (Schenuit et al 2021). Similar proposals have been made in the UK for the Environmental Land Management Scheme planned to replace the CAP (CCC 2020). Co-benefits for fisheries and reef conservation may potentially provide further opportunities to incentivize ERW.

Overall, NET deployment raised the aragonite saturation rate directly by lowering atmospheric CO<sub>2</sub> and indirectly in the case of ERW by addition of alkalinity. However, considerable uncertainty in the aragonite saturation responses to NET deployment exists, as defined by cumulative distribution functions every 20 years beginning from 2020 (supplementary material figures S3–S5). For all scenarios, we find that the percentage of coral reefs in supersaturated waters with respect to  $\Omega_{\rm arg}$  of 3.25 varied between 10% and 93% in the 1st three time periods (2020–2080) and between 23% and 96% from 2080 to 2100 within 60% confidence interval. For  $\Omega_{\rm arg}=3.5$ , these values are within the range 3%–60% for the 1st three periods and from 4% to about 78% for the last period in all scenarios.

These large uncertainties imply that basing policy responses on central estimates of coral reef damage carries a substantial risk of drastically underestimating actually realised damage. Nevertheless, protecting this biodiversity could greatly impact coastal fisheries, cultural services and tourism which together generate annual revenue of around US \$42 billion globally (after conversion to 2020 US dollars) (Gattuso and Hansson 2011). Assuming the average total cost of ERW at around US \$160 per tonne of CO<sub>2</sub> drawdown (Beerling et al 2020), this revenue amounts to more than 13% of the annual total costs, therefore, it provides an important and sustainable financial incentive for long-term application of ERW unaffected by the fluctuation of carbon price as we approach a net-zero emissions future.

Our simulation framework is based on an intermediate complexity Earth system model (GENIE), a class of models with utility in quantifying large-scale feedbacks and uncertainties of atmospheric CO<sub>2</sub> addition and removal on long timescales (centuries to millennia) not readily tractable with high complexity Earth system models (e.g. Taylor *et al* 2016, Jeltsch-Thömmes *et al* 2020). The carbon-cycle

responses of this GENIE configuration have previously been shown to be consistent with those of a 15 model intercomparison (Collins et al 2013) that included high complexity models such as HadGEM2-ES, with GENIE ensemble responses spanning the multi-model range (Joos et al 2013). In addition, the simulated global climate response for RCP2.6 confirms earlier analyses conducted by more complex Earth system models showing it to be broadly consistent with the 2 °C Paris agreement target, and calculated mean end-of-century surface pH (8.0), in agreement with IPCC projections (Bopp et al 2013). Thus, the results of our simulations offer a realistic first assessment of ERW and CCS deployment. We recognize however that higher-complexity modelling is required for evaluation of local scale impacts that cannot be reliably resolved at our model resolution.

Here, for simplicity, and in the absence of field data, we neglected modification or precipitation of dissolved inorganic carbon and alkalinity in rivers and estuaries, and assumed the fluxes resulting from ERW are delivered unaltered to coastal ocean cells. However, observation and modelling studies of riverine and coastal mixing processes (Kwon et al 2021) suggest a greater delivery of land carbon from rivers and groundwater to the oceans than previously realized. This supports our assumption for efficient delivery of ERW products from rivers to the oceans. In focusing on alkalinity and ocean pH effects, we neglect possible increases in dissolved silica fluxes and trace elements (Beerling et al 2018, Bach et al 2019) in stream water and ultimately the oceans. Additionally, increased silica delivery might favour diatoms over problematic non-siliceous algae to benefit fisheries production (Sommer et al 2002, Ittekkot et al 2006) and could strengthen CO<sub>2</sub> removal by stimulation of the oceanic biological pump (Köhler et al 2010). The importance of marine nutrient biogeochemistry to microbial activities (Köhler et al 2013, Moore et al 2013), however, makes further investigation of the extent to which ERW can mitigate the nutrient limitation worthwhile.

Another limitation of the current work is that silicate weathering rates underpinning ERW are sensitive to climate changes, including temperature and soil hydrology, and legacy effects of repeated rock dust applications that allow CDR per unit area to rise over time (Taylor et al 2016, Edwards et al 2017, Beerling et al 2020). By using a fixed CDR for the entire 80 year duration of our simulations (2020–2100), we neglect possible changes in ERW efficiency and consequently CDR associated with both varying climate and repeat ERW treatments (Taylor et al 2016). The results of a separate, offline approximation of climate change effects on ERW (section 2.2) suggest a potential 10% error in CDR over 80 years, and highlight the need for further analysis with a detailed dynamic ERW model.

#### 5. Conclusion

In this study, we investigated the possible future behaviour of the Earth system in response to 2 Gt CO<sub>2</sub> yr<sup>-1</sup> drawdown by ERW deployment on croplands for 80 years within the context of the RCP2.6 mitigation scenario. Our analyses compare CDR via ERW deployment with equivalent CDR via CCS and with co-deployment scenarios of both ERW and CCS. The conclusions below were made accordingly:

- ERW increases the probability of meeting the 1.5 °C Paris target at 2100 from 23% to 42%, while co-deployment increased this further to 67%. The results confirmed that the 2 °C temperature target is likely to be met in RCP2.6. The difference between the 1.5 °C and 2 °C thresholds, however, is likely to be decisive for the survival of many reefs, especially those located in the tropics (Climate Action Tracker 2020).
- The individual ERW and CCS deployment scenarios decreased the atmospheric CO<sub>2</sub> concentration similarly by 11 ppm and reduced global temperature rising to 1.56 °C by the end of the century. Co-deployment of both NETs had additive effects (i.e. 0.1 °C cooling each with ERW and CCS, and 0.2 °C cooling with co-deployment) without adverse Earth system interactions diminishing CO<sub>2</sub> sequestration effectiveness.
- The co-benefit of ERW on ocean chemistry could further improve the living conditions of environmentally sensitive reef-building corals by reducing ocean acidification, especially in south Asia. Nevertheless, the results of all NET deployment scenarios indicate large uncertainties regarding the reversibility of the consequences of high-level climate change mitigation (RCP2.6).

#### Data availability

The data that supports the findings of this study are available from the corresponding author upon reasonable request.

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