# Enhanced weathering strategies for stabilizing climate and averting ocean acidification

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Chemical breakdown of rocks, weathering, is an important but very slow part of the carbon cycle that ultimately leads to CO<sub>2</sub> being locked up in carbonates on the ocean floor. Artificial acceleration of this carbon sink via distribution of pulverized silicate rocks across terrestrial landscapes may help offset anthropogenic CO<sub>2</sub> emissions<sup>1-5</sup>. We show that idealized enhanced weathering scenarios over less than a third of tropical land could cause significant drawdown of atmospheric CO<sub>2</sub> and ameliorate ocean acidification by 2100. Global carbon cycle modelling<sup>6-8</sup> driven by ensemble Representative Concentration Pathway (RCP) projections of twenty-first-century climate change (RCP8.5, business-as-usual; RCP4.5, medium-level mitigation)<sup>9,10</sup> indicates that enhanced weathering could lower atmospheric CO<sub>2</sub> by 30-300 ppm by 2100, depending mainly on silicate rock application rate (1 kg or  $5 \text{ kg m}^{-2} \text{ yr}^{-1}$ ) and composition. At the higher application rate, end-of-century ocean acidification is reversed under RCP4.5 and reduced by about two-thirds under RCP8.5. Additionally, surface ocean aragonite saturation state, a key control on coral calcification rates, is maintained above 3.5 throughout the low latitudes, thereby helping maintain the viability of tropical coral reef ecosystems<sup>11-14</sup>. However, we highlight major issues of cost, social acceptability, and potential unanticipated consequences that will limit utilization and emphasize the need for urgent efforts to phase down fossil fuel emissions<sup>15</sup>.

Since 1992, over 190 nations agreed to limit anthropogenic CO<sub>2</sub> emissions to avoid 'dangerous' human-made climate change<sup>16</sup>, yet massive expansion of fossil fuel extractions, including shale gas and tar sands, is allowing emissions to grow<sup>17</sup>. Avoiding dangerous climate change may therefore require the controversial deployment of carbon dioxide removal (CDR) schemes<sup>4,18</sup>, so-called 'negative emissions' strategies whereby CO<sub>2</sub> is captured and removed from the atmosphere. The Fifth Assessment Report of the Intergovernmental Panel on Climate Change<sup>12</sup> and the US National Research Council Report<sup>18</sup> both recognized enhanced terrestrial weathering of silicate rocks as an important but poorly constrained CDR approach. At present, natural weathering of silicate and carbonate rocks consumes  ${\sim}0.25\,PgC\,yr^{-1}$  of atmospheric CO2, which is  ${\sim}3\%$  of fossil fuel emissions<sup>19</sup> ( $\sim$ 9–10 PgC yr<sup>-1</sup>). Artificially accelerating this land-based CO<sub>2</sub> sink involves the intentional application of pulverized silicate rocks to vegetated landscapes to markedly enhance CO<sub>2</sub> consumption<sup>1-5</sup>. However, assessments so far have excluded primary drivers of soil mineral weathering, especially

terrestrial ecosystem processes and feedbacks from  $CO_2$  and future climate change, limiting our understanding of its capacity to offset fossil fuel  $CO_2$  emissions<sup>12</sup>.

Here we present spatially resolved analyses of enhanced weathering by terrestrial ecosystems as a macro-engineering CDR option based on idealized cases for distributing pulverized silicate rocks in the tropics using multi-model ensemble projections (Coupled Model Intercomparison Project, CMIP5) of twenty-firstcentury climate change<sup>9,10</sup>. Our modelling framework includes climate-plant-soil linkages important for regulating mineral weathering by coupling a detailed weathering model with a dynamic global vegetation model and accounting for land surface hydrology, topography and lithology<sup>6,7</sup> (Methods). We assess effects of enhanced weathering on net CO<sub>2</sub> consumption and examine feedbacks on atmospheric CO<sub>2</sub> and ocean chemistry over the next century using a suite of five CMIP5 general circulation model (GCM) simulations (1° latitude  $\times$  1° longitude)<sup>9,10</sup> for each of two Representative Concentration Pathway scenarios (RCPs): RCP8.5 (business-as-usual), and RCP4.5 (medium-level stabilization of emissions); postscripts (8.5 and 4.5) denote radiative forcing  $(W m^{-2})$  in year 2100 relative to year 1750 (Supplementary Information). Assessments are undertaken for various application rates of the igneous rocks dunite (>90% olivine,  $Mg_2SiO_4$ ; ref. 3) and harzburgite (50-90% olivine), which are both commercially mined, and basalt, for which major resources exist in terrestrial large igneous provinces (LIPs; ref. 20) (Fig. 1). These rates fall within the range adopted in the early 1930s for rejuvenating European forest soils with basalt to encourage tree growth<sup>21</sup>.

Our simulations indicate that terrestrial weathering can be markedly increased by distributing pulverized silicate rocks throughout the tropics ( $30^{\circ}$  N to  $30^{\circ}$  S), potentially consuming hundreds of petagrams ( $1 \times 10^{15}$  g) of CO<sub>2</sub> by 2100 (Fig. 1). Ensemble median CO<sub>2</sub> consumption by terrestrial weathering increases towards a maximum as the total rock applied increases, with olivine-rich dunite and harzburgite being about twice as effective as basalt for equivalent application rates (Fig. 1a–c). We present CO<sub>2</sub> consumption curves assuming mixing depths of 10 cm and 30 cm for each application rate; 10 cm is probably the minimum mixing depth, given intense precipitation events, the distribution of macropores, and bioturbation by invertebrates in tropical soils down to depths of 30–50 cm (Supplementary Information). In the model, CO<sub>2</sub> consumption by weathering increases when added rock grains mix deeper in the soil, particularly at the 5 kg m<sup>-2</sup> yr<sup>-1</sup>

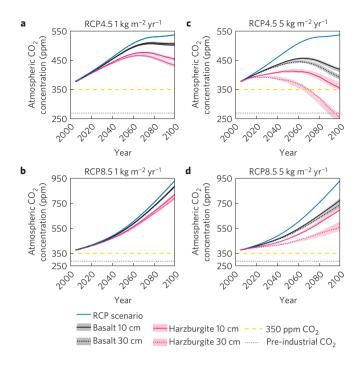
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#### 1,800 d 1,800 а consumption (PgC) atmospheric CO<sub>2</sub> consumption (PgC) Cumulative end-of-century 1,500 Cumulative end-of-century 1,500 Dunite reserves 1,200 1.200 900 900 atmospheric CO, 600 600 300 300 0 0 2 3 4 5 7 2 3 4 5 6 Rock applied (log<sub>10</sub> Pg) Rock applied (log<sub>10</sub> Pg) b е 1.800 1800 consumption (PgC) consumption (PgC) Cumulative end-of-century 1,500 Cumulative end-of-century 1,500 Harzburgite reserves 1.200 1.200 900 900 atmospheric $CO_2$ atmospheric CO, 600 600 300 300 0 0 2 3 4 5 7 2 3 4 6 5 Rock applied (log<sub>10</sub> Pg) Rock applied (log<sub>10</sub> Pg) f С 900 900 atmospheric CO<sub>2</sub> consumption (PgC) consumption (PgC) Cumulative end-of-century Cumulative end-of-century .IP basalt reserves 600 600 atmospheric CO<sub>2</sub> 300 300 2 3 4 5 6 2 3 4 5 Rock applied (log<sub>10</sub> Pg) Rock applied (log<sub>10</sub> Pg) RCP Application rate Mixing depth: Squares 5 kg m<sup>-2</sup> yr<sup>-1</sup> Filled 30 cm 4.5 Circles 1 kg m<sup>-2</sup> yr<sup>-1</sup> Open 10 cm 8.5

Figure 1 | Enhanced weathering from pulverized silicate rock additions to the tropics increases CO<sub>2</sub> consumption. a-c, End-of-century CO<sub>2</sub> consumption by enhanced terrestrial weathering with dunite (a), harzburgite (**b**), or basalt (**c**) as a function of total rock applied, defined as the product of rate and an increasing treated land area in the tropics (30° S to 30° N). Simulations are shown for the Representative Concentration Pathway (RCP) 8.5; median and range for five climate model simulations for each application scenario. Symbols indicate reductions in CO2 consumption and total rock applied when application is limited to 20 Mkm<sup>2</sup> of tropical weathering hotspots; symbol shape and fill denotes application rate and mixing depth scenario, respectively, for each curve. Vertical red lines show estimated total resources for each rock type (for basalt, solid, dashed and dot-dashed lines represent basalt resources in the Ethiopian, Deccan and Paraná Traps, respectively). The shaded area denotes uncertainty in upper values of global dunite resource availability (Supplementary Information). d-f, Corresponding ensemble ranges using dunite (d), harzburgite (e), or basalt (f) for high and low application scenarios for each of five climate model simulations for both RCP8.5 and RCP4.5, assuming a mixing depth of 30 cm.

application rate, because mineral saturation, a chemical brake on weathering, occurs more slowly in a larger soil solution volume. Overall  $CO_2$  consumption patterns for a particular RCP scenario show a consistently narrow range of variation across the five



**Figure 2** | Enhanced weathering lowers atmospheric CO<sub>2</sub> with projected twenty-first-century climate change. **a**,**b**, Effects of low additions of silicate rock to 20 Mkm<sup>2</sup> of tropical weathering hotspots for two mixing depths (10 cm and 30 cm) on the atmospheric CO<sub>2</sub> concentration for RCP4.5 (medium-level mitigation) (**a**) and RCP8.5 (business-as-usual) (**b**). **c**,**d**, As for **a**,**b**, but with higher additions of silicate rocks to the same areas of the tropics. In all panels, the pale blue line indicates the 'control' run with RCP-driven weathering, without additions of silicate rock. Envelopes and lines show the smoothed (five-year boxcar) ranges and medians, respectively, of results from five climate models for each RCP.

ensemble GCMs (Fig. 1d–f). For a given application rate, the magnitude of  $CO_2$  consumption is similar for the business-as-usual (RCP8.5) and medium-level mitigation (RCP4.5) scenarios (Fig. 1d–f), largely because the runoff for the two scenarios is similar (Supplementary Information).

Comparing cumulative end-of-century amounts of pulverized rock added to the tropics with estimated total resources indicates dunite has limited utility for long-term atmospheric CO<sub>2</sub> removal<sup>3</sup> (Fig. 1), whereas sufficient harzburgite and basalt resources exist for the application rates considered here (Fig. 1, Supplementary Information). The rock mass required can be reduced by restricting application to regional intense tropical weathering 'hotspots' (Fig. 1 and Supplementary Information). Such optimization reduces the land area required by more than two-thirds, from 69 to 20 Mkm<sup>2</sup>, and total rock mass by 70%, whilst still achieving ~80-89% of the effect (Fig. 1a-c, symbols). Hotspot land areas are primarily tropical forests, except parts of Asia which are croplands. However, basalt can promote crop growth on highly weathered acidic tropical soils<sup>22,23</sup> by increasing soil alkalinity, cation exchange capacity and the availability of growth-limiting phosphorus, with associated reductions in Al and Mn toxicity<sup>23,24</sup>. Ample basalt resources exist within the major LIPs in the tropics (Ethiopian Traps, Deccan Traps and Paraná Traps) to support simulated application rates (Fig. 1) and these sources could exploit existing infrastructure for distribution. Meeting silicate rock demand would require largescale mining operations, for example, throughout the major tropical LIPs, with production rates exceeding those for coal and adverse consequences for local ecosystems.

As  $CO_2$  is removed from the atmosphere by enhancement of the weathering carbon sink, the carbon cycle responds by

Table 1   Projected mean global	air temperature and change in	n temperature at year 2100.

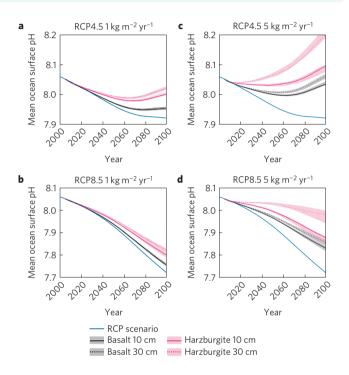
	Warming at 2100 (°C)		Warming averted at 2100 (°C)*	
	RCP4.5	RCP8.5	RCP4.5	RCP8.5
Control (no enhanced weathering) <sup>†</sup>	$1.4 \pm 0.01$	$3.0 \pm 0.01$	n/a	n/a
IPCC range of projected warming $^{\ddagger}$ (ref. 12)	1.1-2.6	2.6-4.8	n/a	n/a
Enhanced weathering scenario				
Harzburgite (1 kg m $^{-2}$ yr $^{-1}$ )	$0.8 \pm 0.04$	$2.5 \pm 0.04$	$0.7 \pm 0.04$	$0.5 \pm 0.04$
Harzburgite (5 kg m $^{-2}$ yr $^{-1}$ )	$-0.7 \pm 0.2$	$1.4 \pm 0.1$	$2.2 \pm 0.2$	$1.6 \pm 0.1$
Basalt (1 kg m <sup><math>-2</math></sup> yr <sup><math>-1</math></sup> )	$1.2 \pm 0.02$	$2.8 \pm 0.01$	$0.2 \pm 0.02$	$0.2 \pm 0.01$
Basalt (5 kg m <sup><math>-2</math></sup> yr <sup><math>-1</math></sup> )	$0.5\pm0.05$	$2.3\pm0.05$	$0.9\pm0.05$	$0.7\pm0.05$

Values show mean ± s.d. of five climate models (CMIP5) for the change in end-of-century mean global temperature simulated with the GENIE Earth system model using revised CO<sub>2</sub> trajectories associated with each rock type and application rate with an applied rock mixing depth of 30 cm (Fig. 2). \*Relative to control (no enhanced weathering); <sup>†</sup>Relative to 2005; <sup>†</sup>Relative to 1986-2005.

redistributing carbon among surface reservoirs (atmosphere, ocean, soil, and land biosphere), with CO2 out-gassing by the ocean in particular offsetting some of the artificial drawdown<sup>17</sup>. There is, consequently, a 'rebound' effect whereby each extra mole of CO<sub>2</sub> consumed does not translate into the removal of a mole of atmospheric CO<sub>2</sub> over time. We therefore estimate the effects of our CO<sub>2</sub> consumption fluxes on the RCP4.5 and RCP8.5 atmospheric CO<sub>2</sub> trajectories through the twenty-first century with the welltested GENIE Earth system model<sup>8</sup>, which broadly captures these responses. Distributing 1 kg m<sup>-2</sup> yr<sup>-1</sup> of pulverized silicates across 20 Mkm<sup>2</sup> of tropical weathering 'hotspots' lowers atmospheric CO<sub>2</sub> concentrations by  $\sim$ 40 ppm (basalt) or  $\sim$ 140 ppm (harzburgite) by year 2100 in both the RCP4.5 and RCP8.5 climate change scenarios (Fig. 2a,b). Increasing the application rate to  $5 \text{ kg m}^{-2} \text{ yr}^{-1}$  over the same 20 Mkm<sup>2</sup> 'hotspot' areas lowers the atmospheric CO<sub>2</sub> concentration further by 150–180 ppm under both RCPs (Fig. 2c,d), with an increasing effect at deeper soil mixing depths. For RCP4.5, atmospheric CO<sub>2</sub> by 2100 is reduced from 540 ppm to 390–350 ppm (basalt) or 350-250 ppm (harzburgite), sufficient to play a major role in stabilizing climate and avoid seeding long-term amplifying climate feedbacks<sup>17</sup> (Fig. 2). For the business-as-usual RCP8.5 scenario, however, the lowest simulated CO<sub>2</sub> concentration by year 2100 in the high-end weathering scenario is still ~730 ppm (basalt) or 690-560 ppm (harzburgite; Fig. 2d). This suggests even massive intervention in Earth's carbon cycle with basalt is unable to drive atmospheric CO<sub>2</sub> down close to the target of 350 ppm by 2100, an estimated requirement for restoring planetary energy balance and stabilizing climate<sup>17</sup>.

Future climate warming averted by engineering  $CO_2$  removal through enhanced weathering is dependent on climate sensitivity and the actual atmospheric  $CO_2$  concentration. Calculated endof-century 'warming averted' figures for the enhanced weathering scenarios using GENIE, which has a low-to-medium climate sensitivity, are summarized in Table 1. For high application rates, warming averted ranges from 0.9 to 2.2 °C for RCP4.5 and from 0.7 to 1.6 °C for RCP8.5 (Table 1). At low application rates, corresponding ranges of warming averted are 0.2–0.7 °C for both RCPs (Table 1). These numbers suggest that, theoretically at least, negative emissions from enhanced weathering could play a role alongside conventional mitigation reducing net  $CO_2$  emissions in limiting future warming<sup>25</sup>.

Unmitigated future increases in atmospheric  $CO_2$  will not only drive climate change but also ocean acidification, including reduced saturation of surface waters with respect to aragonite, threatening reef-building coral ecosystems<sup>11-14</sup>. Artificially enhanced tropical weathering increases land-to-ocean fluxes of alkalinity and dissolved inorganic carbon, and raises freshwater pH to the upper range of tropical rivers (Supplementary Information). These fluxes, together with reduced atmospheric  $CO_2$  (Fig. 2), tend to counter the negative impacts on ocean carbonate chemistry (Figs 3 and 4). Our simulations driven by decreased  $CO_2$  (Fig. 2) and increased



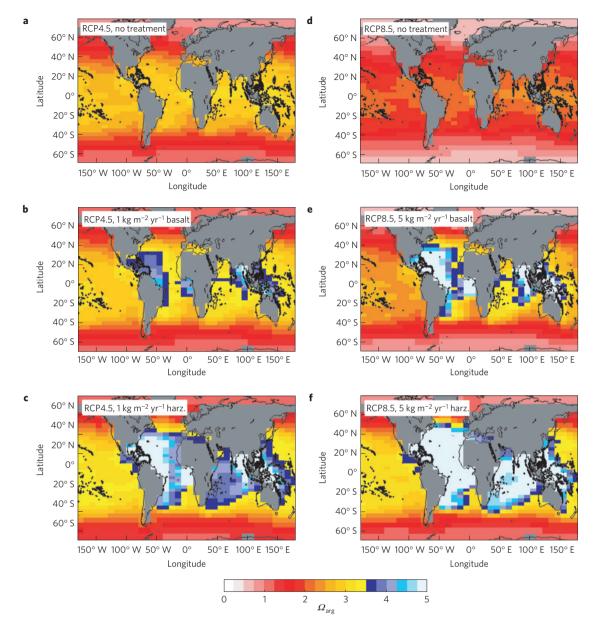
**Figure 3** | Enhanced weathering ameliorates future ocean acidification caused by projected twenty-first-century increases in atmospheric CO<sub>2</sub>. **a**,**b**, Effects of increased alkalinity fluxes resulting from additions of  $1 \text{ kg m}^{-2} \text{ yr}^{-1}$  of silicate rock to 20 Mkm<sup>2</sup> of tropical weathering hotspots mixed to two soil depths on global surface ocean pH for RCP4.5 (medium-level mitigation) (**a**) and RCP8.5 (business-as-usual) (**b**). **c**,**d**, Effects of increased alkalinity fluxes resulting from higher additions of silicate rocks to the tropics on global surface ocean pH for RCP4.5 (**c**) and RCP8.5 (**d**). Envelopes and lines show the smoothed (five-year boxcar) ranges and medians, respectively, of results from five climate models for each RCP.

alkalinity fluxes show that additions of 1 kg m<sup>-2</sup> yr<sup>-1</sup> of harzburgite or basalt across the weathering 'hotspots' can mitigate future ocean acidification by an average of around 0.1 pH units (Fig. 3a,b). A higher silicate application rate (5 kg m<sup>-2</sup> yr<sup>-1</sup>) reverses future surface ocean acidification under RCP4.5, restoring global mean surface ocean pH to year 2000 levels or even pre-industrial levels by 2100 (Fig. 3c). Even for RCP8.5, 5 kg m<sup>-2</sup> yr<sup>-1</sup> reduces ocean acidification by approximately two-thirds by year 2100 (Fig. 3d; Supplementary Information).

Coral reef health is linked to the ocean's aragonite saturation state ( $\Omega_{arg}$ ), which affects the rate at which corals can precipitate this crystalline mineral form of calcium carbonate and build skeletons<sup>13,14</sup>. Modern coral reefs generally occur where open ocean

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**Figure 4** | **Enhanced weathering raises the aragonite saturation state of the ocean by 2100. a**-**c**, Simulated global distribution of the aragonite saturation state ( $\Omega_{arg}$ ) of the surface ocean in 2100 for RCP4.5 with no addition of silicate rocks (**a**), and with the addition of 1kg m<sup>-2</sup> yr<sup>-1</sup> of basalt (**b**) or harzburgite (**c**) distributed over the tropics. **d**-**f**, Corresponding simulations for RCP8.5 but with applications raised to 5 kg m<sup>-2</sup> yr<sup>-1</sup>. In each panel black indicates the distribution of reef-building corals (www.reefbase.org). All simulations are for a mixing depth of 30 cm.

waters have a value of  $\Omega_{arg}$  above a postulated<sup>14</sup> critical threshold of ~3.5. But under RCP4.5, and especially RCP8.5,  $\Omega_{arg}$  at reef sites drops to <3.5 by 2100 (Fig. 4), potentially threatening them with extinction<sup>14</sup>. In simulations for RCP4.5 and RCP8.5, enhanced weathering with 1 kg m<sup>-2</sup> yr<sup>-1</sup> of silicates (basalt or harzburgite) and reduced atmospheric CO<sub>2</sub>, generates conditions of  $\Omega_{arg} > 3.5$  across main regions of coral reef occurrence (Fig. 4b,c). Hence, although this low dosage is rather ineffective at reducing global CO<sub>2</sub> (Fig. 2), it has specific regional advantages in terms of helping protect coral reefs. Applications of either rock at high rates (5 kg m<sup>-2</sup> yr<sup>-1</sup>) markedly increase  $\Omega_{arg}$  above 3.5 in both RCP4.5 and RCP8.5 scenarios at low latitudes (Fig. 4e,f). Enhanced weathering on land could therefore be more effective at alleviating stressors on coral reef health, including ocean acidification, than enhanced open ocean dissolution of olivine<sup>26,27</sup>.

Our spatial and temporal analyses incorporate detailed plantsoil-climate interactions regulating soil mineral weathering rates. Driven by detailed geographical variations in projections of twenty-first-century climate change and vegetation activity, they indicate the maximum potential of enhanced weathering for climate change mitigation, including amelioration of ocean acidification. However, our scenarios represent a suite of idealized cases in which application of pulverized silicate rocks over forests is assumed to be achievable over large regions. Consequently, they help define the maximum potential CDR capacity of the approach. Not only will practical barriers to mineral transport and distribution on biodiverse tropical forests limit large-scale deployment, but roll-out on such a large scale may be undesirable from both conservation and ecosystem services viewpoints. Deployment might be achievable in areas undergoing reforestation/afforestation or on agricultural lands where existing infrastructure could be utilized for rock grain distribution and management. However, well-documented field studies on graded spatial scales are needed before any significant implementation.

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Large-scale geoengineering is ethically fraught<sup>15</sup> and poses dangers of both foreseeable and unforeseen consequences. Enhanced weathering employs naturally occurring minerals and reactions, and therefore falls in the category of 'soft geoengineering' along with reforestation and agricultural techniques increasing soil carbon storage<sup>28</sup>. Nevertheless, it still requires comprehensive environmental impact assessments and dust mitigation strategies at production and deployment sites. Furthermore, the production and distribution of pulverized rock carries health risks to anyone coming in contact with it because the particle sizes involved are respirable (Supplementary Information). Harzburgite, for example, includes asbestos-related minerals that carry health risks to local populations near application sites. However, carefully implemented, enhanced weathering may have added benefits, including fertilizing ocean and terrestrial CO2 capture by marine diatoms3,26,29 and tropical forests, respectively. Such effects, which are not considered here, could help offset energy costs<sup>3,5</sup> associated with extensive rock mining, grinding and transportation operations that might lower its sequestration capacity by  $\sim 8-33\%$ .

Estimated implementation costs (combined capital and operational) for achieving an initial 50 ppm drawdown of atmospheric  $CO_2$  are \$60–600 trillion for mining, grinding and transportation, assuming no technological innovation, with similar associated additional costs for distribution (Supplementary Information). On this basis, costs of enhanced weathering as a 'negative emissions' option exceed an estimate of \$50–200 trillion<sup>17</sup> for air capture of 50 ppm  $CO_2$ , but with the latter being less effective in reducing ocean acidification in important coral reef regions. These issues support calls for the alternative of a rising international carbon fee<sup>17</sup>. We proffer enhanced weathering not as a panacea for erasing impacts of fossil fuel burning, but as a sobering indication of actions that may be required if fossil fuel emissions are not phased down rapidly.

#### Methods

Methods and any associated references are available in the online version of the paper.

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#### Author contributions

D.J.B. conceived the study with input from all co-authors. L.L.T. undertook weathering model development and simulations, J.Q. and R.M.S.T. undertook data analyses, P.A.K. and A.R. provided model set-up support and advice, M.R.L. analysed the CMIP5 climates. D.J.B. led the writing with contributions from all co-authors, especially J.H., A.R., J.Q. and L.L.T.

#### **Additional information**

Supplementary information is available in the online version of the paper. Reprints and permissions information is available online at www.nature.com/reprints. Correspondence and requests for materials should be addressed to D.J.B.

#### **Competing financial interests**

The authors declare no competing financial interests.

#### Methods

Terrestrial rock weathering modelling. Terrestrial vegetation delivers the carbon-energy flux in the form of photosynthate to roots and associated mycorrhizal fungal networks which fuels biotic rates of mineral dissolution<sup>30</sup>. In our rock weathering model, the subsurface organic carbon flux is stoichiometrically coupled to the rate of primary production and the uptake of inorganic nutrient ions by roots and mycorrhizal fungi which regulate the ionic composition and charge balance of the microscopic region of soil pore fluids at the organism-mineral interface (the mycorrhizosphere)<sup>6,7</sup>. This balance controls local pore fluid pH and organic ligand concentrations at the reacting mineral surfaces that control the rates of mineral dissolution through well-described reaction mechanisms<sup>31</sup>. We therefore couple an extended version of a previously published rock weathering model<sup>6,7</sup> with the Sheffield Dynamic Global Vegetation Model (SDGVM; ref. 32). Our simulations employed fixed land use patterns<sup>33</sup>. The SDGVM simulates terrestrial carbon, nitrogen and water cycling by vegetation and soils, including land surface net primary productivity (NPP), hydrology, autotrophic and heterotrophic soil respiration, and dissolved organic carbon pools<sup>32</sup>. SDGVM is comparable in its sensitivity of response to CO2 and climate to other DGVMs (refs 34,35).

In the extended weathering model, rainwater with an initial pH determined by the partial pressure and solubility of atmospheric CO2(g) and ion charge balance percolates through the soil at a rate determined by the SDGVM runoff. Soil solution chemistry is calculated both within and outside the mycorrhizosphere within the soil profile, which is divided into ten layers specified at increasing depths, with runoff composition from each layer mixed and advected into the next layer. Mixing of bulk soil and mycorrhizosphere water is conceptualized as, but not explicitly parameterized as, hydrodynamic dispersion and diffusive exchange of bulk soil fluid solutes with the decreasing mycorrhizosphere volume with depth<sup>6</sup>, and pore fluid transport to plant roots for transpiration. The model recalculates the soil solution chemistry of each layer, with the dissolution reaction progress of primary silicate minerals ceasing on reaching the theoretical saturation state of the fluid with respect to the dissolving mineral. Thermodynamic equilibria constrain both the forward reaction for mineral dissolution (see equation (1) below) and the concurrent precipitation of secondary phases, including kaolinite, gibbsite and amorphous silica, which act as sinks for dissolved Al and Si released by weathering. On carbonate-bearing lithologies, pore fluids are equilibrated with any calcite, dolomite or gypsum that might be present before weathering of any silicate minerals present takes place. This treatment assumes sufficient carbonates to maintain solubility equilibrium during the simulation time horizon and is not suitable for trace amounts of carbonate minerals, which would become completely depleted in non-carbonate lithologies. Soil solution chemistry, therefore, depends on solubility equilibrium with existing carbonate or sulphate minerals, precipitation of secondary phases, including kaolinite and amorphous silica, and weathering of primary silicate minerals.

Underlying the weathering model is a rasterized version of the Hartmann and Moosdorf<sup>36</sup> lithological map, for which we prepared a lithological database giving the proportions of the parent minerals in each rock type. Each rock type has its own mineral assemblage (see below), and each mineral *m* weathers according to the general rate law<sup>37</sup> with mineral-specific parameter values for SA, *k*, *n* and *E*:

$$\operatorname{Rate}_{m} = \operatorname{SA}_{m} \sum_{i} \left[ k_{i,m}^{298.15} \exp\left[ \frac{-E_{i,m}}{R} \left( \frac{1}{T} - \frac{1}{298.15} \right) \right] a_{i}^{n_{i,m}} \left( 1 - \left[ \frac{Q_{m}}{\operatorname{Ksp}_{m}} \right] \right) \right]$$
(1)

where Rate<sub>m</sub> is given in mol m<sup>-2</sup> mineral s<sup>-1</sup>, SA<sub>m</sub> is mineral surface area (m<sup>2</sup>), *i* is the individual weathering agent, such as [H<sup>+</sup>],  $k_{i,m}$  is the rate constant,  $E_{i,m}$  is the apparent activation energy (kJ mol<sup>-1</sup>), *R* is the gas constant (kJ mol<sup>-1</sup> K<sup>-1</sup>), *T* is temperature (K),  $a_i$  is the molar activity of weathering agent *i* (moll<sup>-1</sup>) and  $n_{i,m}$  is the reaction order.  $Q_m = \prod_j a_j^{a_j}$  is the ion activity product of the soil solution, where  $a_j$  is the activity of solute *j* raised to the power of its stoichiometry  $s_j$  on the product side of the chemical equation describing the dissolution of mineral *m* (Supplementary Tables 2 and 3). Ksp<sub>m</sub> is the solubility constant for mineral *m* (Supplementary Table 2). Activities are approximated by concentrations.

The model accounts for changes in mineral surface area due to relief (standard deviation of orography), as described previously<sup>7</sup>, and includes an empirical surface area correction for each rock type which accounts for age effects<sup>38</sup>, internal porosity, grain size errors and deviation of particle shape from perfect spheres. Soil water residence times and riverine fluxes depend on runoff calculated by SDGVM. The model calculates monthly fluxes of CO<sub>2</sub> consumption, alkalinity (Ca<sup>2+</sup>, Mg<sup>2+</sup>, K<sup>+</sup> and Na<sup>+</sup>) and dissolved inorganic carbon, and is verified against water chemistry and discharge data from a global suite of river catchments.

**Validation.** Simulated terrestrial fluxes of CO<sub>2</sub> consumed by rock weathering in 42 watersheds worldwide<sup>39</sup> using the Climate Research Unit 3 (CRU 3) climate<sup>40</sup> at  $1^{\circ} \times 1^{\circ}$  resolution are validated against fluxes derived from catchment-scale estimates based on stream-water chemistry (Supplementary Information). We generated fluxes for basins in the World Resources Institute's shapefile<sup>41</sup> and compared these to the 45 basins (Table 3 in ref. 39) where the basin names could be matched. Given the test aims to compare model and observed weathering rates,

three catchments were rejected on the basis of markedly different basin areas or runoff (defined as two standard deviations of the mean residual). Therefore, 42 basins were retained for validation, except in the case of carbonate  $CO_2$  consumption, where a further five basins were excluded owing to lack of carbonates in the modelled lithologies.

The response of modelled weathering rates in Iceland to temperature change accords with observed chemical weathering flux responses to climate warming over the past four decades in un-glaciated Icelandic catchments<sup>42</sup>. Regional responses also support the CO<sub>2</sub> and climate change sensitivity of our approach. Adopting a more complex soil weathering module coupled to a DGVM (ref. 43), another group predicted a similar increase in CO<sub>2</sub> consumption in the Mackenzie River Arctic watershed from 355 ppm CO<sub>2</sub> with modern climate to 560 ppm CO<sub>2</sub> with an associated warmer climate, based on results from the RCP4.5 simulations (Supplementary Information). Estimated pH values of river runoff calculated from alkalinity fluxes and equilibrated to ambient CO<sub>2</sub> are comparable to measurements reported for a range of tropical river catchments (Supplementary Information).

Geoengineering simulations. For the atmospheric CO<sub>2</sub> concentration trajectories defined by the two RCPs considered here (RCP4.5 and RCP8.5), the five General Circulation Models (GCMs) produce monthly temperature, relative humidity and precipitation to drive SDGVM. Monthly climate datapoints closest to the desired coordinates are bilinearly interpolated in space before daily values for the month are estimated using climate statistics. These estimated daily climates force SDGVM. Distributed silicate rock grains are treated as perfect monomineralogical spheres with a nominal starting diameter of 10 µm. Initial total surface areas for the added silicates are calculated for each mineral using the total mass applied, specified diameter, weight fraction for the mineral, mineral specific gravity and the equations for the volume and surface area of a sphere. As weathering progresses, mass is removed and the fractional change in total surface area is estimated using the fractional change in mass raised to the power 2/3. This treatment assumes that each particle is a shrinking sphere. The total mass and surface area for each mineral are increased according to dose rate. No attempt is made to model a particle size distribution for either the starting silicate rock grain size or the individual mineral residues following weathering. Pulverized silicates are mixed with a specified depth of soil, without modelling bioturbation processes or the transport behaviour of suspended materials in infiltrating water. Soil water residence times and riverine fluxes depend on runoff modelled by SDGVM. Mean reactive surface areas of autochthonous primary soil minerals are corrected for erosion and relief7. The model assumes no change in porosity or water movement with depth, and there is no preferential transport of different particle sizes.

**Mineralogy of pulverized silicates.** The mineralogy of each simulated pulverized silicate rock is listed in Supplementary Table 4. The model basalt silicate mineralogy is based on the normative composition for a normal alkali tholeiitic basalt<sup>44</sup>, neglecting some minor phases such as magnetite. Our dunite composition follows ref. 45. We use the mineralogy of the Troodos harzburgite, with lizardite rather than chrysotile (asbestos), as this is the dominant serpentine near Troodos<sup>46</sup> and as it is sensible to avoid rocks with a large proportion of asbestos for health reasons. Our results are therefore conservative with respect to the proportion of unserpentinized olivine and the relative amounts of lizardite and chrysotile present.

GENIE Earth system global CO2 and ocean biogeochemistry modelling. The climate and ocean circulation of the GENIE Earth system model has been calibrated by two-dimensional reanalysis fields of surface air temperature and humidity and three-dimensional observational fields of ocean distributions of temperature and salinity<sup>47</sup>. The carbon cycle is calibrated against observed ocean phosphate and alkalinity distributions<sup>47,48</sup>. The resulting marine carbon cycle has been extensively used and evaluated, including against observations of natural (for example,  $\Delta^{14}$ C) and perturbed anthropogenic carbon cycling. GENIE is also compatible with observational uncertainty<sup>8</sup> and other (generally higher resolution) carbon cycle model responses to CO2 perturbation<sup>49-51</sup>. The version used here is as summarized by ref. 8, which includes a 76 m deep surface ocean and the cycling of Fe described by Annan and Hargreaves<sup>52</sup> (except with biological uptake following ref. 53), but lacks a mixed layer scheme. Our results therefore represent a pessimistic case for weathering and, in the real world, one might have a slightly shallower surface layer with even higher saturation. The addition of Fe co-limitation of marine biological export results in a less than 1% change in the projected year 1994 anthropogenic CO2 inventory compared to the PO4-only model8.

We simulated the effects of CO<sub>2</sub> consumption by enhanced weathering on atmospheric CO<sub>2</sub> drawdown and ocean biogeochemistry in two steps. First, we diagnosed the annual CO<sub>2</sub> emissions compatible with a particular RCP CO<sub>2</sub> concentration projection over the twenty-first century by prescribing that CO<sub>2</sub> curve and backing-out emissions. Cross-checking these diagnoses by performing forward simulations with annual CO<sub>2</sub> emissions in the absence of enhanced weathering reproduced the RCP4.5 and RCP8.5 CO<sub>2</sub> curves to within 1 ppm. Then,

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for each application scenario, we subtracted the annual  $\mathrm{CO}_2$  consumption due to enhanced weathering from the diagnosed RCP emissions and forced GENIE with the remainder.

The ocean biogeochemistry simulations incorporate reduced atmospheric CO<sub>2</sub> and increases in the alkalinity and dissolved inorganic carbon fluxes. In each case, those for 2005–2015 and 2089–2099 are transferred to a 36  $\times$  36 global grid, migrating land fluxes on the weathering model continents to the ocean following standard directional paths. GENIE linearly interpolated these flux forcings for intermediate years. All GENIE runs were based on the same starting state, comprising a 10,000-year pre-industrial spin-up followed by a transient experiment forced by historical changes in atmospheric CO<sub>2</sub> concentration until year 2006, as described in refs 8 and 48.

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