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### The tropical forest carbon cycle and climate change

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## The tropical forest carbon cycle and climate change

2 Edward T A Mitchard

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- 4 Tropical forest makes an approximately neutral contribution to the global carbon
- 5 cycle, with intact and recovering forests taking in as much carbon as is released
- 6 through deforestation and degradation. In the near future, tropical forests will likely
- 7 become a carbon source, due to continued forest loss and the impact of climate
- 8 change on the remaining forests' ability to capture excess atmospheric CO<sub>2</sub>. This will
- 9 make it much harder to keep global warming below 2° C. Encouragingly, recent
- international agreements commit to halting deforestation and degradation, but a
- lack of fundamental data for monitoring and model design makes policy action
- 12 difficult.

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16 Tropical forests have played a critical role in the changing atmospheric carbon 17 concentrations of the industrial age, acting both as a very significant emissions 18 source as they have been logged or burned, but also as a carbon sink, as the 19 remaining forests have taken in much of the extra carbon added to the atmosphere. 20 To illustrate this, from 1960 to 2015 anthropogenic emissions of carbon totalled 21 408 PgC, 80% from burning fossil fuel and making cement, and 20% from (largely 22 tropical) land use change<sup>1</sup>. However, the atmospheric CO<sub>2</sub> stock grew by 'only' 180 23 PgC over that period<sup>2</sup>, meaning that 55% of these emissions were taken in by the 24 Earth system, reducing the climate change caused. There are uncertainties around 25 the relative contributions of the three main locations of this sink, namely the oceans, 26 northern hemisphere forests, and tropical forests<sup>1</sup>, but likely between a quarter and 27 a third was due to the enhanced growth of trees in tropical forests<sup>3,4,5</sup>. 28 Understanding the size and causes of this sink is crucial for predicting its evolution 29 over the coming century: the tropical land sink is known to be very variable year-to-30 year<sup>1,6,7,8,9</sup>, and reverse to a source in hotter years<sup>10</sup>, suggesting there is a real risk 31 that over the coming decades under climate change it will become a major source 32 every year. 33 The tropical land sink is the least certain major component of the global carbon 34 budget<sup>1</sup>. There are various possible ways of estimating its size (Box 1), but none 35 estimates the sink directly, and all have high uncertainty due to either sparse 36 sampling<sup>5,11,12,13,14,15</sup> or coarse resolution<sup>6,7,10</sup>. As a result, the main way the land sink 37 has been estimated is as the residual of the sum of all other components of the 38 global carbon cycle<sup>1</sup>; however with this method it is not possible to estimate the 39 relative contribution of the northern hemisphere and tropical forests to the sink. 40 Further, some other components of the global carbon cycle are also very uncertain 41 and variable, such as the Land Use Change (LUC) flux<sup>1,16</sup>, making accurately 42 estimating trends in the sink very difficult. This uncertainty greatly limits the 43 development and testing of theories and models, and thus means there is a wide

44	divergence of predictions as to how the sink will change under different climate
45	change scenarios and policy interventions.
46	Considering all sources of evidence, it appears likely that tropical forests are in the
47	process of switching from being approximately neutral, to a net source, as the intact
48	forest sink declines in $size^{1,3,7,17,18}$ . This decline is caused by a combination of the
49	decrease in the area of intact forest $^{19,20}$ , and increasing temperatures and drought
50	reducing trees' ability to respond to higher $CO_2$ concentrations by growing
51	faster $^{12,13}$ . With both forest loss and climate change likely to accelerate over this
52	century, tropical forests are likely to release ever more carbon, making keeping
53	global warming to less than $2^{\circ}$ C above pre-industrial levels very difficult $^{21,22}$ .
54	The carbon balance of tropical forests
55	Living tropical trees store 200-300 Pg of carbon <sup>5,23,24,25</sup> , about a third as much as is
56	held in the atmosphere <sup>1</sup> . This stock is very dynamic: tropical trees perform about
57	$60\%$ of the the world's photosynthesis, capturing $\sim$ 72 Pg of carbon from the
58	atmosphere every year <sup>26</sup> , but also releasing a similar amount back to the
59	atmosphere through respiration of both the plants themselves and other
60	organisms <sup>17,27</sup> . Given these large fluxes, a small proportional change in either the
61	uptake or release of $CO_2$ can result in a large net source or sink. There are multiple
62	lines of evidence that over at least the past 50 years these two processes have been
63	out of balance, with tropical vegetation increasing in biomass by >2 Pg C yr-1, about
64	$1\ \%$ per year $^{5,28,29}$ . It is clearly though that this sink has very high inter-annual
65	variability, driven by temperature and rainfall fluctuations $^{16,30,31}$ .
66	The tropics are also the main nexus of global land use change, with deforestation
67	and forest degradation (where some trees are removed but the area retains
68	sufficient trees to be classed as a forest) releasing somewhere between 0.5 and 3.5
69	$Pg\ C\ yr^{-1}$ (refs 7,20,32,33,34,35,36,37). The wide range of estimates is partly due to
70	differences in time period, but mostly caused by differing definitions and included
71	processes, different methods (Box 1), and wide uncertainty bounds.

Comparing different methods, there is consensus that the overall carbon balance of the tropics was approximately neutral over the past decades, with sinks in intact and regrowing forests equal in magnitude to sources from deforestation and forest degradation<sup>4,5,7</sup>(Fig. 1). However, it is also clear that in abnormally hot years, such as during strong El Niño events, the tropics becomes a major net source<sup>1,10</sup> (Fig. 1d). The following section examines the current magnitude of the major sources and sinks. Then the evidence for trends in these over recent decades is considered, along with their likely future pathways, and whether international policy can change these trends.

### Carbon sources

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Deforestation is easy to map using optical satellite data, with free Landsat satellite data meaning most countries produce their own maps<sup>20</sup>, with large scale independent maps also available and broadly consistent<sup>19,39</sup>. Deforestation affects very large areas: about 100 Mha were deforested in the tropics from 2000-2012, about 50% in Latin America, 30% in SE Asia, and 20% in Africa (ref 19 using a forest definition of >25% canopy cover; similar values are found in studies<sup>20,39</sup>). The main drivers of this deforestation differ by location, with large-scale commercial agriculture/pasture and mining dominating in much of Latin America, palm oil and pulp/paper plantations in SE Asia, and smallholder agriculture and only more recently mining and commercial agriculture/plantations driving deforestation in Africa<sup>32</sup>. Estimating the carbon released from deforestation is more difficult than assessing its spatial extent. Often estimates are produced by simply multiplying the area deforested by a single carbon density per unit area value, with the result therefore very sensitive to that single value: normally this is the mean carbon density from a number of local forest inventory plots, but to be accurate they must be numerous and representative of the type of forest deforested. At a pantropical scale recent studies have improved on this by overlaying the deforestation data on continuous

maps of carbon density<sup>7,32,35,37</sup>, though such methods have errors caused by their

101 carbon data having a coarser resolution than their deforestation data, and the 102 carbon maps having potential large regional biases<sup>25,40</sup>. Overcoming these issues, 103 there has been some consensus in recent years that the flux from gross tropical 104 deforestation in the 2000s was 0.6-0.8 Pg C yr<sup>-1</sup> (refs 32,35). 105 In contrast, it is much harder to estimate the area affected, and carbon losses 106 caused, by forest degradation<sup>41,42</sup>. Partly this is because degradation is caused by a 107 wide variety of processes with different impacts, including commercial logging, 108 fuelwood extraction, sub-canopy cultivation, grazing, fire, and edge effects caused by 109 nearby deforestation<sup>41,43</sup>. But further it is because the only remote sensing methods 110 that are sensitive to degradation are coarse resolution, with each pixel containing 111 twenty to thousands of hectares<sup>4,6,7,10,14,15,36,44</sup>, and thus far exceeding the <1 ha size 112 of most degradation events<sup>42,45</sup>. This means that estimates inevitably mix the fluxes 113 from deforestation, forest degradation, regrowth of previously disturbed forest, as 114 well as changes in intact forest, into a single combined change per pixel. 115 There are studies that have used inventory plots to estimate fluxes from degradation<sup>46,47</sup>, however these give numbers on a per hectare basis that are hard to 116 117 scale, as we do not have maps of degradation. High resolution remote sensing from 118 LiDAR<sup>48</sup> or Synthetic Aperture Radar<sup>45</sup>, combined with local field biomass plots, can 119 directly map the carbon stock changes from deforestation, degradation and 120 regrowth at a suitable resolution, but so far such studies are rare and have only 121 been used for small areas, so cannot help much with pantropical estimates. They can 122 however show the broad ratio between carbon losses from deforestation and 123 degradation; though this varies widely in space and time, there is a suggestion that 124 at a large scale degradation is responsible for perhaps twice the carbon release of 125 deforestation, with great regional variation<sup>7,45</sup>. Further, there is agreement that 126 degradation is more significant as a proportion of total emissions in Africa than in 127 South America or SE Asia<sup>29,38,41,42</sup>. 128 Tropical peat forests are independently a major potential source of carbon. Peat is 129 carbon-rich partially decayed organic matter, associated with waterlogged and

130 acidic conditions, which exists in layers up to 20 m thick under tropical swamp 131 forests. Recent large discoveries under the forests of the Congo<sup>49</sup> and 132 Amazon<sup>50</sup> basins has increased the known area of tropical peat by 50% to 577,000 133 km<sup>2</sup> (combining figures from refs<sup>49,51</sup>). These peat forests have very high carbon 134 densities, meaning they have the potential to make an outsized contribution to the 135 global carbon cycle: about 5% of tropical forests overlay peat, but they store 70-130 136 Pg C (ref 49), significant compared to 200-300 Pg C in all tropical trees<sup>5,23,24,25</sup>. The 137 majority of tropical peat is in SE Asia, which has been extensively cleared and 138 drained in recent decades (over half the area present in 1990 had been deforested 139 or degraded by 2008<sup>52,53</sup>), therefore contributing significantly to land use change 140 emissions by releasing 0.3-0.54 Pg C yr<sup>-1</sup> (refs 3,16). This large flux is included in the 141 land use change numbers in Figure 1, but excluded from normal values giving the 142 deforestation flux (e.g. refs 7,32,35,37), as such methods exclude below-ground 143 carbon. Further, intact, degraded and drained peatlands in SE Asia have been 144 subject to fires in El Niño years that have released much larger quantities of carbon: 145 up to 2.5 Pg C in a single year, sufficient to cause noticeable anomalies in the 146 atmospheric CO<sub>2</sub> growth rates<sup>10,54</sup>. In contrast, the peatlands of the Congo and 147 Amazon basins were until recently largely undisturbed, so are not currently thought 148 to contribute significantly to the land use change flux<sup>55</sup>. 149 Even undisturbed peatlands are however likely losing carbon due to climate 150 change<sup>3,51,53</sup>. This is hard to monitor because satellites can only see the trees, but 151 the vast majority of the carbon in peat forest ecosystems is instead stored in 152 belowground as peat. Gruelling fieldwork to ascertain peat depths and extract cores 153 for chemical analysis is a necessity to ascertain carbon stocks, but these point 154 estimates are hard to scale to large areas due to great spatial variability<sup>49,53</sup>. 155 Tracking losses is further complicated because of the range of mechanisms through 156 which peats can lose carbon: respiration in peats releases CH<sub>4</sub> as well as CO<sub>2</sub>; 157 burning releases CO and C in addition to CO<sub>2</sub>; and dissolved and particulate organic 158 carbon is washed away in rivers. There is some data on non-CO<sub>2</sub> emissions: both 159 satellite and modelling datasets suggest that all tropical peatlands are significant

methane sources<sup>56</sup>, and field data suggests that both intact and disturbed peats in SE Asia have significant fluvial organic carbon transport, which has increased by >30% from 1990-2008<sup>52</sup>. While more baseline data is needed, it seems likely that climate change caused warming and droughts are resulting in peat forests being net sources of carbon<sup>3,29,51,53</sup>.

### Carbon sinks

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The remeasurements of millions of trees in networks of forest inventory plots across the undisturbed forests of Latin America, Africa and SE Asia suggest these forests have all been gaining carbon at a similar rate of ~0.5 Mg C ha-1 yr-1 over the past decades, adding up to a total sink of a little over 1 Pg C vr<sup>-1</sup> (refs<sup>5,13,57,58</sup>). Though it has been suggested that artefacts in plot remeasurements could lead to erroneous findings of increasing carbon storage with time<sup>59</sup>, there is also considerable evidence of a sink of around this magnitude from independent methods, such as atmospheric inversion studies<sup>4,14,15</sup>, satellite data<sup>7,36</sup>, and models<sup>17</sup>, so there is little doubt that it exists. Regrowing and disturbed forest are also clearly taking in carbon from the atmosphere, but as with forest degradation, there is little reliable data on the magnitude of this sink. Studies tracking individual field plots show great variation: following total clearance there was no increase in biomass at all after 20 years at a site in Uganda<sup>60</sup>, but over 10 Mg C ha<sup>-1</sup> yr<sup>-1</sup> throughout the first ten years in moist sites in Latin America<sup>11</sup>. A meta-analysis of 1468 plots in 45 sites found average recovery rates of 3.05 Mg C ha<sup>-1</sup> yr<sup>-1</sup> for the first 20 years, and that sites regained 90% of old-growth biomass values after a median of 66 years<sup>11</sup> (though biodiversity does not recover in these timescales 11,42,60). As we do not have good maps of past disturbance it is hard to turn plot values into tropical estimates, but these data are consistent with inversion studies and satellite observations of a current flux with a similar magnitude to the intact forest sink (i.e. 1 Pg C yr<sup>-1</sup>), with large uncertainty<sup>3,4,5</sup>.

188	Trends in the sources and sinks
189	Despite the uncertainties related to individual components, we do have a reasonable
190	understanding of the carbon balance of the tropics in the recent past, with various
191	methods agreeing that the tropics make an approximately neutral contribution to
192	the global carbon budget <sup>3,4,7,36</sup> (Fig. 1). However, we are much less certain about
193	how the system is changing.
194	While there is general agreement that total forest area is shrinking across the
195	tropics, there is considerable controversy as to whether the rate of loss is rising or
196	falling. Official figures from the Food and Agriculture Organisation (FAO, collated
197	from national statistics) show a decline in annual net forest loss rates since
198	$2000^{20,38}$ , whereas satellite-based data see an increase in the loss rate $^{19}$ (Fig. 2).
199	Some of this difference can be explained by differing definitions of forest and the
200	precise area compared, but the difference in trend is too large to be explained by
201	these alone. It has long been known that FAO statistics are not ideal for analysing
202	trends <sup>61</sup> : while some tropical countries probably produce very good data, their
203	monitoring capacity is variable <sup>62</sup> . As an example, 14 African countries have reported
204	exactly the same annual change in forest area every year from $1990$ - $2015^{38}$ , even
205	though other datasets see significant changes in their rates of loss through time <sup>33</sup> .
206	On balance, the evidence from the remote sensing data sources appears more
207	reliable than the FAO data. This is because the data from Hansen et al. $^{19}$ is produced
208	consistently across the tropics; detects country-level trends where we have good
209	alternative sources of data, for example correctly seeing the rapid reduction in
210	deforestation in Brazil $^{63}$ , and the recent rapid acceleration of loss in the Democratic
211	Republic of Congo <sup>64</sup> ; and matches well to detailed high resolution data in a study
212	comparing areas with different patterns of forest loss <sup>65</sup> . It is therefore likely that the
213	rate of deforestation in the tropics is increasing.
214	Over the coming decades, as the global demand for agricultural, timber and mineral

commodities, and local population density, continue to grow, it seems likely that the

rate of forest loss will continue to increase<sup>32,63,64</sup>. Current areas that are largely

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undisturbed due to inaccessibility, such as the peat forests of the western Amazon and the Congo, will likely become accessible and suffer deforestation<sup>55</sup>. Eventually the rate of forest loss will stabilise and start to fall, partly because the area of remaining unprotected forest will have greatly decreased, but also because the that once countries reach a sufficient level of economic development and forest loss, policy and civil society drivers result in the remaining forest area stabilising or even increasing<sup>66</sup>. However this point may come only once most forest has been lost, and even once countries reach this point (such as Vietnam, China or much of the developed world), they themselves will export deforestation to less economically developed countries as their economies demand increasing levels of commodities<sup>67</sup>. The case of Brazil makes an interesting case study here: it greatly reduced its rate of forest loss from 2005-2014<sup>19</sup>, due to reductions in global commodity prices and policy interventions<sup>63</sup>, but the rate has since increased again and could climb faster as the global demand for agricultural and mineral commodities increases, and laws promote development not forest protection<sup>63,68</sup>. Forest degradation is hard to map and monitor: as discussed previously there is little hard evidence about its overall current magnitude, let alone trends, though we suspect it involves a much larger area than deforestation each year<sup>7,44,45,46</sup>. Normally degradation appears to be closely associated with deforestation<sup>44</sup>, and it is reasonable to assume in the future as the area of forest that is accessible increases, due to fragmentation caused by deforestation and road building, the area of forest degraded each year will also increase. About 20% of all tropical forest is now within 100 m of an edge, with 84% of these edges anthropogenic, and this proportion will continue to increase as more anthropogenic edges are created each year than closed up<sup>43</sup>. Commercial logging, a major direct cause of degradation but also a driver of increase fragmentation and access roads, also seems likely to increase in impact as ever more logging concessions are granted<sup>41,42</sup>. Degradation due to fire may also increase with time due to climate change, as well as increasing fragmentation<sup>42</sup>. Overall it is hard to believe that the area of forest degraded each year is not increasing, nor that it will stop increasing in the near future.

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247 248 As the area of degraded forest increases, so does the area of forest with the potential 249 for regrowth; thus the proportion of the forest sink that comes from previously 250 disturbed forest is likely to increase with time<sup>3</sup>. Disturbed forest normally takes up 251 carbon much faster per hectare than undisturbed forest, though with high 252 variability $^{11,69}$ . Under climate change the rate of growth that could be achieved by 253 disturbed forest could increase further, due to CO<sub>2</sub> fertilization<sup>17,70</sup>. However, other 254 factors (increased temperature, changing precipitation) could negate this effect: a 255 specific modelling test as to whether land use change increased the land sink under 256 an extreme CO<sub>2</sub> scenario found only one of four models predicted an increased sink, 257 with the others showing no increased sink<sup>70</sup>. Fundamentally the size of the sink 258 from regrowing forest is very hard to model using current knowledge, with a high 259 level of divergence between models<sup>71</sup>. Separately, there is evidence that in the long 260 term, once deforested, land is ultimately normally permanently converted to 261 agriculture, pasture or settlements; and most degraded land is itself ultimately 262 deforested<sup>72</sup>. This pattern is unlikely to change as the global economy and 263 population continue to grow, so ultimately carbon captured in the regrowing sink 264 may not remain captured long. 265 It is also difficult to predict how the intact forest sink will change with climate 266 change because we know that climate change will have opposing pressures<sup>5</sup> (Figure 267 3). Theory and modelling studies generally agree that the most likely cause of the 268 sink is  $CO_2$  fertilisation: as atmospheric  $CO_2$  concentrations have risen from  $\sim 280$ 269 ppm in 1850 to over 400 ppm today fixing carbon through photosynthesis is easier, 270 with CO<sub>2</sub> concentrations in leaves increasing for a given level of stomatal opening 271 (itself limited by water availability)<sup>17</sup>. This effect should continue as CO<sub>2</sub> levels 272 increase<sup>8,17</sup>, but climate change will also raise temperatures, increasing soil and 273 plant respiration rates, and droughts and fires will also increase, directly killing

trees (Fig. 3). Further, deforestation and degradation will continue to reduce the

area of intact forest that can act as a sink. Many studies therefore suggest that

climate change could lead to a reduction in the sink strength, and ultimately its

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277 reversal into a source<sup>10,73,74,75,76</sup>. There is evidence from networks of field plots that 278 this is already happening, with the sink magnitude decreasing through time<sup>12,13</sup>. 279 However, models do not generally predict a reduction in the land sink, with many 280 predicting the CO<sub>2</sub> fertilisation will offset the negative influence of climate change 281 on ecosystem respiration and tree mortality<sup>8,17,70,77</sup>. For example, six coupled 282 climate models run under the same CO<sub>2</sub> growth scenario found changes in tropical 283 land carbon storage between 1960-2099 ranging from -11 Pg C to +319 Pg C, with a 284 mean of +172 Pg C (Ref 8). The differences between these models is mostly caused 285 by differences in the sensitivity of tropical vegetation to temperature, and the extent 286 to which temperature rises due to non-CO<sub>2</sub> forcings (for example reduction in 287 aerosol concentrations or other greenhouse gases), which do not come with the 288 positive CO<sub>2</sub> fertilization effect<sup>8</sup>. The variability in model prediction of the current 289 size of the intact forest carbon sink<sup>8,71,78,79</sup>, and model's lack of critical factors such 290 as mortality of large trees caused by droughts<sup>76</sup>, makes it difficult to use model-291 based predictions for predicting trends in the forest sink. Therefore the best evidence is from field plots<sup>12,13</sup> and satellites<sup>6,10</sup>, which show that the intact forest 292 293 sink is weakening, and becomes a source in unusually hot years, suggesting that it 294 will likely reverse under climate change. 295 There is so little data on the carbon balance of intact peat forests that it is hard to 296 speculate with confidence how they are changing. But it is likely that increasing 297 temperature and variable precipitation has increased the rate of carbon loss, 298 especially when combined with draining and other disturbance, and that such losses 299 are likely to accelerate in future<sup>49,52,53,55</sup>. However there are high uncertainties, and 300 an increase in basic observations of peat forests are urgently needed.

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Modelling the future of tropical carbon 303 304 From recent trends, it appears likely that the current major sources of emissions 305 (deforestation and degradation of forests, including peat forests) will at least stay 306 stable or likely increase over the coming decades<sup>32,63,64</sup>, whereas the current sinks 307 (from intact and regrowing forest) will likely reduce, and could reverse and become 308 sources<sup>10,73,74,75,76</sup>. Therefore it is very likely that tropical forests will become a net 309 source of  $CO_2$  to the atmosphere in the near future, if they have not already<sup>3</sup>. 310 Estimating the size of this tropical source through time is very difficult though, even 311 when considering a specific scenario of land use and climate change, due to complex 312 feedbacks and interactions between different elements of the carbon cycle, climate 313 change, people, policy and the global economy. The climate modelling community has produced ever more complex models that 314 315 include the complex feedbacks between land use change, climate change and intact 316 forest<sup>71</sup>. A noticeable difference between the 4th and 5th Assessment Report of the 317 International Panel on Climate Change (IPCC) is that the latter uses Earth System 318 Models (ESMs) for much of its predictions, rather than Atmosphere-Ocean General 319 Circulation Models (AOGCMs)<sup>29</sup>. ESMs include all the processes of AOGCMs, but add 320 representations of biogeochemical cycles, including the full carbon cycle, and couple 321 these cycles with other components allowing for feedbacks. For example, 322 deforestation in a AOGCM simulation will increase the atmospheric CO<sub>2</sub> 323 concentration, and change the physical properties of the ground surface, but only in 324 an ESM will the smoke and dust released from deforestation, and their subsequent 325 effect on atmospheric chemistry and the rate of photosynthesis of the remaining 326 trees, be modeled<sup>71</sup>. 327 In order to standardise the inputs to modelling climate change under different 328 scenarios to 2100, for is 5th Assessment Report the IPCC developed four

Representative Concentration Pathways (RCPs)<sup>29</sup>. These are trajectories of

atmospheric greenhouse gas concentration and consequent radiative forcing, and

are named after the radiative forcing in the year 2100 relative to pre-industrial

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levels in W m<sup>-2</sup>: RCP2.6, RCP4.5, RCP6 and RCP8.5. They are based on underlying assumptions about social and technological development, and the extent to which climate mitigation activities take place, with RCP8.5 assuming annual fossil fuel emissions increase rapidly to about 2070 before eventually stabilising, whereas RCP2.6 assumes emissions peak by 2020 and then decrease rapidly<sup>80</sup>. Ideally it would be possible to provide confident predictions for the size of the forest sinks under these different scenarios, but unfortunately ESMs still have high variability in their predictions of the tropical carbon cycle, and cannot agree as to whether the tropical land surface will gain or lose carbon overall under the different scenarios<sup>8,81</sup>. Much of the uncertainty in tropical land surface prediction ( $\sim$ 80%) is caused not by scenario uncertainty but differences in model structure<sup>71</sup>, specifically for the tropics dominated by differences in predictions of the effect of specific climate parameters and CO<sub>2</sub> concentration on NPP and vegetation turnover (including structural shifts, wild fires and mortality)82. It is thus urgent that we improve our knowledge of how the components of the tropical carbon cycle function, in order to better design and test such models.

### **Policy impact on tropical forests**

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349 The extreme RCPs (RCP2.6 and RCP8.5) assume similar levels of conversion of 350 tropical forest to agriculture<sup>81</sup>, with the differences coming largely from the degree 351 of fossil fuel burning. However, in reality big developments in national and 352 international policy since the last IPCC report in 2013 have made reducing tropical 353 deforestation and degradation, and restoring previously degraded and deforested 354 tropical land, a key pillar of reducing climate change. This is sensible, as unless 355 tropical deforestation and degradation is reversed the task of halting the rise in 356 atmospheric CO<sub>2</sub> concentrations would involve decarbonising the global economy at 357 a likely unfeasible rate<sup>21,22</sup>, and offers the possibility of a different path for the 358 tropical carbon cycle than continuing current trends. 359 The Paris Agreement of 2015, now ratified by 176 of the 197 countries of the 360 UNFCCC and having entered into force in 2016, aims to keep increases in global

average temperature to 'well below 2°C above pre-industrial levels'. It does not set specify how this should be reached, but includes a strong statement in Article 5 that countries 'should take action to conserve and enhance ... forests'83. In order to assist developing countries with meeting Article 5, it 'encourages' all countries to engage in REDD+ ('reducing emissions from deforestation and forest degradation, and the role of conservation, sustainable management of forests and enhancement of forest carbon stocks in developing countries')83. The details of financing and monitoring have yet to be agreed, but there is significant optimism that REDD+ can succeed in increasing the area of forest, and the proportion of it that is undisturbed, compared to business as usual<sup>32,84,85</sup>. Most tropical countries have thanks to 'REDD Readiness' funding increased their capacity to monitor changes in their own forests<sup>62</sup>, and are submitting Forest Reference (Emission) Levels, official baselines against which future emissions can be compared, and plans for reducing emissions below these levels if funding is provided. Though the Paris Agreement is ambitious in overall terms, its proposals on forests lack concrete detail, stating only that countries should 'take action'. However, there are other international agreements involving many or most of the same countries that are more specific. For example, the New York Declaration on Forests, signed by 192 organisations including 40 governments in 201486, aims to: "At least halve the rate of loss of natural forests globally by 2020 and strive to end natural forest loss by 2030". This was ambitious, but some believed it was achievable<sup>32</sup>. More ambitious still, the UN Sustainable Development Goals<sup>87</sup>, agreed in 2015, include as Target 15.2 an aim to "By 2020 ... halt deforestation". This was included not just because preventing climate change is a key aim of the SDGs, but because healthy tropical forests are important for the achievement of most of the 17 SGDs<sup>66</sup>. Few believe deforestation can really be stopped so fast, but these international agreements will spur at least some countries to enact policies to greatly reduce their deforestation rates<sup>32,63</sup>. The New York Declaration on Forests further aims to restore 150 million hectares of currently deforested or degraded land by 2020, and 350 million hectares by 2030.

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391 There are worries related to these ambitious targets: there is a risk that natural 392 grasslands will be afforested, leading to a loss of biodiversity and potentially also 393 soil carbon<sup>88</sup>, or that agriculture will be displaced by restored forest, leading to 394 more deforestation elsewhere<sup>89</sup>. Also many countries have not committed to meet 395 their goal solely through natural forest (e.g. through leaving degraded land to 396 regenerate naturally, with the greatest ecological and long-term carbon benefits), 397 but instead will plant monocultures of exotic tree species such as teak and rubber. 398 Nonetheless, this overall enthusiasm for restoration of forests should be positive for 399 tropical carbon storage (Fig. 3), and if the sites are chosen well and the restoration 400 type carefully considered, it could be highly beneficial for people and the 401 environment<sup>21,89</sup>. 402 Looking further into the future, the Paris Agreement mandates that by the second 403 half of this century remaining anthropogenic emissions will be balanced by sinks<sup>22</sup>. 404 This will require a large program of capturing carbon directly from the atmosphere and storing it elsewhere<sup>29</sup>. As tropical trees are by far the most efficient carbon 405 406 capture method known, a proposal called Bioenergy with Carbon Capture and 407 Storage (BECCS) is proposed, which will generate energy through the burning of 408 tropical plantations and store the  $CO_2$  produced belowground<sup>22</sup>. To meet the 409 negative emissions targets needed to keep global warming below 2°C by 2100. 410 models suggest it would need to be implemented on an enormous scale (400 - 800 411 Mha, for comparison India covers 329 Mha)<sup>22,29</sup>. This would clearly make the tropics 412 a major carbon sink, but with negative biodiversity and ecosystem services 413 consequences. 414 Overall, these agreements are sufficient to dramatically change current trends, and 415 if fully implemented would increase the forest carbon storage of the tropics 416 markedly over the coming century. However, meeting the targets would involve 417 drastic and coordinated action from people, policy makers and companies 418 globallv<sup>32,63</sup>.

### Safeguarding tropical forest carbon

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The evidence suggests that unless the world makes a coordinated effort to change 420 421 from its current course, deforestation, degradation and climate change will combine 422 to make the tropics a net source of carbon to the atmosphere over the coming 423 decades. This is despite increasing CO<sub>2</sub> levels making it easier for intact forests to 424 photosynthesise and absorb carbon<sup>8,17</sup>. However, if we were able to stop 425 deforestation and forest degradation, leave currently degraded forests to recover, 426 and reforest, as targeted in international agreements, then tropical forests would 427 instead likely become a significant carbon sink, contributing to the Paris Agreement 428 goal of keeping mean global temperatures rises to below 2°C<sup>21,22</sup>. Keeping and 429 restoring these forests would have further immense benefits to human wellbeing. 430 through maintaining their biodiversity and ecosystem services<sup>66</sup>. However, two 431 interconnected problems limit the achievement of these goals. Our spatial 432 information on how forests are changing is poor, and a lack of field experiments 433 means ESMs cannot predict well how forests will respond to different climate and 434 land use change scenarios. 435 While we monitor deforestation well, we do not have good data on changes within 436 forests. We have techniques that can observe the integrated carbon flux over large 437 regions, but have very little knowledge of the size of the individual processes 438 involved (such as degradation, regrowth, or the impact of droughts and fire). This 439 makes it hard to design and implement policy: for example no country has reliable 440 baseline figures on their rate of forest degradation<sup>62</sup>, making it hard to set targets or 441 create policies to reduce degradation under REDD+, nor receive payments even if 442 such policies are successful. This also limits model development and testing. 443 New satellite mission such as GEDI and OCO-3 (both planned for launch in 2018), 444 and BIOMASS (2021) will help by producing high resolution, globally consistent 445 maps of forest carbon stock changes for the first time. These will not only assist with 446 targeting and monitoring policies, but also allow us to discover the magnitude of the 447 forest sink at an unprecedented resolution (< 1km<sup>2</sup>) and how local conditions and

climate fluctuations influence it. However these satellites require pantropical forest inventory and airborne LiDAR data for calibration and validation. REDD+ will assist directly here: already significant funding has been spent on designing and setting up monitoring systems and capacity in developing countries<sup>62</sup>. Unfortunately the data collected is rarely made available to the international scientific community, as publishing such data is against the natural instincts of countries, who wish to protect their sovereignty (there are some exceptions, for example field and LiDAR data from recent carbon stock map of DRC is available at http://panda.maps.arcgis.com). Funders and scientists must persuade countries to be more open, or they will not obtain the full benefits from new satellite missions. Better maps of forest carbon stocks will make a big difference, removing the current wide spread of figures on the carbon fluxes from tropical forests (Figs 1&2), supporting REDD+ and other policy efforts to reduce forest loss, and enabling the testing of ESMs and theories as to how tropical forests respond to climate fluctuations and disturbance events. However, these data will not improve our understanding of how forests will respond to climate and CO<sub>2</sub> conditions that do not currently exist, understanding that is necessary for improving ESMs. For this we need field experiments, such as those that artificially drought, warm or increase the CO<sub>2</sub> concentration of large tropical forest plots. Such experiments are expensive to run, and take many years to produce useful results<sup>76</sup>, and therefore inevitably they are almost nonexistant in the tropics<sup>90</sup>. Their development should be supported by governments, as without them there will be no data to develop and test the critical next generation of ESMs<sup>79</sup>.

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Figure legends 478 Figure 1: Tropical forest carbon fluxes assessed using different 479 methods 480 Annual fluxes (in Pg C yr<sup>-1</sup>) into and out of tropical forests for different overlapping 481 482 time periods (a-c) and for a recent El Niño year (d). The net intact forest flux is 483 shown in blue, the net flux in regrowing forest is in pink, and the deforestation and forest degradation flux (including fire) is shown in red. Panels a-c shows there is 484 485 broad agreement that the tropics have made an approximately neutral contribution 486 to atmospheric carbon stocks in the recent past, but panel d shows that in hot and 487 dry years intact forest can become a carbon source, leading to significant net 488 emissions from the tropics. a) Ref 5: data from networks of forest inventory plots, 489 combined with forest area data from country surveys or ref 38. b) Ref 7: data from 490 annual 463 m resolution optical satellite data, calibrated using LiDAR data and field 491 plots from the mid 2000s. Intact and regrowth fluxes are not separated in this 492 method. The figures in the study have been grossed up from biomass to total carbon 493 stock change (i.e. including dead wood, litter, soil) using the data in Ref 5 Table 2 494 (adding 16%). c) Ref 4: data derived from looking for overlap between atmospheric 495 inversion, modelling and field plot estimates. d) Ref 10: data from satellites sensitive 496 to atmospheric CO<sub>2</sub> concentrations for the 2015 El Niño year, contrasting sharply 497 with the other estimates shown. Land use change could not be divided into separate 498 regrowth and loss fluxes in this method. 499 500 FIGURE 2: Contradiction in major forest area change datasets 501 Satellite datasets and nationally reported statistics are in agreement about the rate 502 of net tropical forest loss in the early 2000s, but diverge increasingly with time.

Orange points and trendline (quadratic OLS): net annual forest loss from a

systematic global satellite analysis from the University of Maryland (UMD)<sup>19</sup>, Version 1.4. Forest gain is not assigned to a particular year in this dataset, so is here distributed equally across the time period to give net figures. A forest definition of 10% canopy cover in 2000 was used. Green points and trendline (linear OLS): net annual forest area change across tropical countries from the FAO FRA 2015<sup>38</sup>, as summarised in ref 20. Forest area is reported at 5-year intervals, the change has been calculated between each interval and then divided by 5 to give annual data. A variety of forest definitions are used by countries when producing these figures, with canopy cover ranging from 10-30%. This means that the total area of forest considered for 2000 is higher in the UMD dataset, and would be expected to lead to consistently slightly higher deforestation for the UMD dataset than the FAO dataset. However this difference in forest definition cannot explain the differences in trend, as only  $\sim$ 5% of losses in the UMD dataset are in forest with canopy cover between 10 and 30 %.

# Figure 3: The impacts of climate and land use change on the intact forest carbon sink.

The potential contrasting impacts of climate change and different land use change trajectories on the size of the intact forest carbon sink. Arrows pointing up show how climate change and policy could increase the magnitude of the sink, whereas arrows pointing down show how it will be reduced. All processes will occur to some extent, so predicting how the sink size will change is very difficult.

### Box 1: Methods used to assess the tropical forest carbon balance

**Forest inventory plots:** marked areas of forest where tree diameters are measured and species recorded, enabling estimation of tree mass<sup>91</sup>. Revisiting networks of such plots every ~5 years gives precise estimates of how forest carbon stocks are changing<sup>12,13,57</sup>, though uncertainties are increased because plots are rare and unevenly distributed, with some forest types undersampled. There are also plots that are intensively monitored to give insight into the detail of carbon allocation and use efficiency<sup>92</sup>, and rare experimental manipulations that test the response of trees to conditions that do not naturally exist<sup>76,93</sup>.

**Atmospheric inversions:** There is a sparse network of towers and marine measurement sites across the tropics that permanently collect greenhouse gas concentration and micro-meteorological data. These are supplemented by ship and aircraft data, and combined with atmospheric transport models to estimate the net flows of  $CO_2$  into or out of the atmosphere at a broad, regional scale<sup>4,14,15</sup>.

#### **Satellites** can be used to estimate:

- **Forest area** Landsat satellites have been used to produce consistent estimates of forest cover change since the early 1970s. Many countries produce their own maps, and global 30m resolution forest change data are available from 2000 onwards<sup>19</sup>. However loss data are much more reliable than gain, and relating the area-based data to carbon stock changes is difficult.
- **Carbon stocks** A unique LiDAR satellite operating in the mid-2000s collected distributed estimates of tree height in 70 m footprints, which were combined with field plots and other satellite data to make medium resolution (500 m 1 km pixels) carbon stock maps<sup>23,24</sup>, albeit with large uncertainties<sup>40</sup>. These maps enable estimates of emissions when combined with forest area change data<sup>35</sup>, or when produced annually<sup>7</sup>. It is also possible to estimate carbon stock changes using passive microwave remote

sensing<sup>36</sup>, however the resolution (1-2 times coarser) makes it impossible to separate gain and loss fluxes.

- **GHG concentration** Satellites can measure the greenhouse gas concentrations of narrow columns of the atmosphere with a precision of  $\sim 1 \text{ppm CO}_2$ . These measurements have been used to directly observe the carbon entering and leaving tropical forests, giving information about the size of the tropical forest sink and its reaction to droughts at a continental scale<sup>6,10</sup>. However cloud cover means the observations are sparse in time and space, and the coarse resolution once again means forest loss and gain fluxes cannot be distinguished.

**Modelling:** Given the difficulty with directly observing forest responses to rising CO<sub>2</sub> concentrations and climate changes, dynamic vegetation models are used directly to predict their responses<sup>8,17</sup>. The latest generation of models, Earth System Models (ESMs), include many more processes and feedbacks than traditional Atmosphere-Ocean General Circulation Models (AOGCMs), increasing their predictive power<sup>71</sup>. Models provide information on processes or time periods where we have no other data, and enable us to synthesise our current knowledge about the Earth system to predict the future under specific scenarios of climate and land use change<sup>22</sup>.

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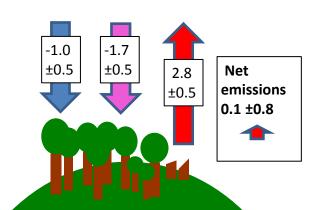
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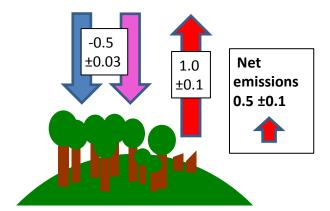
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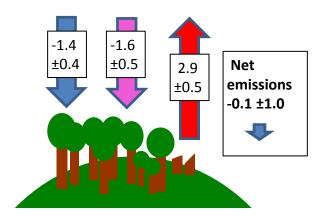
a) Forest inventory plots (2000-7)



b) RS: LiDAR + Optical (2003-14)



c) Combination (1990-2007)



d) El Niño – RS: [CO<sub>2</sub>] (2015)

