# Title:

Differences between carbon budget estimates unravelled

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# Preface:

Several methods exist to estimate the cumulative carbon emissions which would keep global warming to below a given temperature limit. We here review estimates reported by the IPCC and the recent literature, and discuss the reasons underlying their differences. The most scientifically robust number – the carbon budget for CO<sub>2</sub>-induced warming only – is also the least relevant for real-world policy. Including all greenhouse gases and using methods based on scenarios that avoid instead of exceed a given temperature limit results in lower carbon budgets. To limit warming below the internationally agreed temperature limit of 2°C relative to preindustrial levels with >66% chance, the most appropriate carbon budget estimate is 590-1240 GtCO<sub>2</sub> from 2015 onward. Variations within this range depend on the probability of staying below 2°C and on end-of-century non-CO<sub>2</sub> warming. Current annual CO<sub>2</sub> emissions are about 40 GtCO<sub>2</sub>/yr, and global CO<sub>2</sub> emissions thus have to be reduced urgently to keep within a 2°C-compatible budget.

#### Main text:

The ultimate objective of the international climate negotiations is to prevent dangerous anthropogenic interference with the climate system<sup>1</sup>. Since 2010, this objective has been interpreted as limiting global-mean temperature increase to below 2°C relative to preindustrial levels<sup>2</sup>, although discussion remains whether it needs to be strengthened to 1.5°C (for example, see Ref. 3).

Over the past decade, a large body of literature has appeared which shows that the maximum global-mean temperature increase as a result of carbon dioxide emissions is nearly linearly proportional to the total cumulative carbon (CO<sub>2</sub>) emissions<sup>4-11</sup>. Maximum warming is also influenced by the amount of non-CO<sub>2</sub> forcing leading up to the time of the peak<sup>12-14</sup>. This has culminated in the most recent assessment of the Intergovernmental Panel on Climate Change (IPCC) in the form of several estimates of emission budgets compatible with limiting warming to below specific temperature limits. Here, we first explain the underlying scientific rationale for such budgets and then continue with a detailed account of the strengths and limitations of the various budgets reported in both the IPCC Fifth Assessment Report (AR5) and the recent literature, and of the differences between them.

#### The purpose of budgets

The IPCC AR5 Working Group I (WGI) Report<sup>15</sup> indicated that the total net cumulative emission of anthropogenic CO<sub>2</sub> is the principal driver of long-term warming since preindustrial times. Therefore, to limit the warming caused by CO<sub>2</sub> emissions to below a given temperature threshold, cumulative CO<sub>2</sub> emissions from all anthropogenic sources need to be capped to a specific amount, sometimes referred to as carbon budget or quota (which, in the context of this paper, refers to global values and not to emission allowances of single countries).

The near-linearity between peak global-mean temperature rise and cumulative CO<sub>2</sub> emissions is the result of an incidental interplay of several compensating feedback processes in both the carbon cycle and the climate: the logarithmic relationship between atmospheric CO<sub>2</sub> concentrations and radiative forcing, the decline of ocean-heat-uptake efficiency over time, as well as the change of the airborne fraction of anthropogenic CO<sub>2</sub> emissions<sup>15</sup>. This compensating relationship is robust over a range of CO<sub>2</sub> emissions and over timescales of up to a few centuries, with very few exceptions<sup>16</sup>. Such a relationship is not generally available for other anthropogenic radiatively active species. An approximate proportionality exists for other long-lived greenhouse gases (GHG) for warming during this century<sup>12</sup>, while for short-lived climate forcers the rate of emissions leading up to the time of peak warming is important<sup>12-14</sup>.

The unique characteristics of the Earth system's response to anthropogenic carbon emissions allow the definition of a quantity called the transient climate response to cumulative emissions of carbon (TCRE). TCRE is defined as global average surface temperature change per unit of total cumulative anthropogenic CO<sub>2</sub> emissions, typically 1000 PgC. The IPCC AR5 assessed TCRE to fall 'likely' (i.e. with greater than 66% probability<sup>17</sup>) between 0.8 to 2.5°C per 1000 PgC for cumulative CO<sub>2</sub> emissions less than about 2000 PgC and until the time at which temperature peaks.

The constancy of TCRE means that it can also be assessed for the real world by dividing an estimate of CO<sub>2</sub>-induced warming to date by an estimate of anthropogenic CO<sub>2</sub> emissions<sup>5,10</sup>. Such an approach relies on a calculation of GHG-attributable warming using a regression of observed warming onto the simulated response to GHG and other forcings, and an estimate of the ratio of CO<sub>2</sub> to total GHG radiative forcing or temperature response. Alternatively TCRE may be assessed from observations by applying observational constraints to the parameters of a simple carbon-cycle climate model<sup>7,8</sup>, and evaluating the ratio of warming to emissions for the constrained model.

For a carbon budget approach to make sense, TCRE must be reasonably independent of the pathway of emissions. Earlier studies have indeed shown that this is the case<sup>7,8,18,19</sup>, at least for peak warming and monotonously increasing cumulative carbon emissions. If a set carbon budget limit is exceeded,  $CO_2$  needs to be removed actively from the atmosphere afterwards<sup>20-22</sup> to bring emissions back to within the budget. Figure 1 illustrates this path independency (even for moderate amounts of net negative  $CO_2$  emissions), and shows with the simple carbon-cycle and climate model MAGICC<sup>7,23,24</sup> that even with large variations in the pathway of  $CO_2$  emissions during the 21<sup>st</sup> century, the transient temperature paths as a function of cumulative  $CO_2$  emissions are very similar – a characteristic also found in other models<sup>18,25</sup>. Once all pathways achieve the same end-of-century cumulative  $CO_2$  emissions, the temperature projections are virtually identical (Figure 1b).

Given these considerations, carbon budgets are a useful guide for defining and characterizing emissions pathways which limit warming to certain levels, such as 2°C relative to preindustrial.

## An abundance of carbon budgets

Budget for CO<sub>2</sub>-induced warming only

The most direct application of TCRE is to derive cumulative carbon budgets consistent with limiting CO<sub>2</sub>-induced warming to below a specific temperature threshold. For instance, IPCC WGI indicates<sup>26</sup> that limiting anthropogenic CO<sub>2</sub>-induced warming to below 2°C relative to 1861-1880 with an assessed probability of greater than 50% will require cumulative CO<sub>2</sub> emissions from all anthropogenic sources since that period to stay approximately below 4440 GtCO<sub>2</sub>. Alternatively, doing so with a greater than 66% probability would imply a 3670 GtCO<sub>2</sub> budget. These values assume a normal distribution of which the standard-deviation (1-sigma) range is given by the assessed 'likely'

TCRE range of 0.8 to 2.5°C per 1000 PgC (i.e., about 3670 GtCO<sub>2</sub>), and make use of the near-linearity of the ratio of CO<sub>2</sub>-induced warming and cumulative CO<sub>2</sub> emissions<sup>15</sup>.

While being the most robust translation of the TCRE concept into a cumulative carbon budget, it is at the same time also the least directly useful to policy-making. In the real world, non-CO<sub>2</sub> forcing also plays a role, and its global-mean temperature effect is superimposed on the CO<sub>2</sub>-induced warming. A carbon budget derived from a TCRE-based estimate should thus not be used in isolation.

The near-linear relationship of TCRE does hence not necessarily apply to the ratio of total human-induced warming to cumulative carbon emissions (as might be suggested by Figure SPM.10 in Ref. 26). The latter relationship is scenario dependent, because, for example, the percentage contribution of non-CO<sub>2</sub> climate drivers to total anthropogenic warming increases in the future in many scenarios. Therefore, to take into account the influence of non-CO<sub>2</sub> forcing on carbon budgets, the TCRE-based approach can be extended using multi-gas emission scenarios. Multi-gas emission scenarios provide an internally consistent evolution over time of all radiatively active species of anthropogenic origin. They are often created with "integrated assessment models" (IAMs) which represent interactions within the global energy-economy-land system (for examples, see Refs. 27-29).

#### Threshold exceedance budgets

A first, straight-forward methodology to extend TCRE-based carbon budgets for CO<sub>2</sub>-induced warming to budgets that also take into account non-CO<sub>2</sub> warming is here defined as *threshold* exceedance budgets (TEB) for multi-gas warming (see Table 1).

This approach uses multiple realisations of the simulated response to a multi-gas emission scenario. These realisations can either be multi-model ensembles or perturbed parameter ensembles. An example of the former would be simulations of the Representative Concentration Pathways<sup>30,31</sup> (RCP) by Earth-System Models (ESMs) that were contributed to the Fifth Phase of the Coupled Model Intercomparison Project<sup>32</sup> (CMIP5). An example of the latter would be the use of a simple climate model in a probabilistic setup<sup>7,23,24</sup>, as used in the assessments of the IPCC<sup>33-35</sup> as well as in other recent studies<sup>36-38</sup>. From such multi-model or perturbed parameter ensembles, the carbon budget is estimated at the time a specified share (for example, 50% or one third) of realisations exceeds a given temperature limit (i.e., 50% or two thirds of the ensemble members remain below the limit, see orange scenario in Figure 2).

The TEB approach was used by IPCC WGI for determining carbon budgets that account for non-CO<sub>2</sub> forcing<sup>15</sup>. Applying this methodology to the CMIP5 RCP8.5 (Ref. 39) simulations of ESMs<sup>10,40</sup> and Earth-System Models of Intermediate Complexity<sup>41</sup> (EMICs), they found that compatible CO<sub>2</sub>

emissions since 1870 are about 3010 GtCO<sub>2</sub> and 2900 GtCO<sub>2</sub> to limit warming to less than 2°C since the period 1861–1880 in more than 50% and 66% of the available model runs, respectively. Other recent studies<sup>36</sup> have used an extended version of this approach which computes TEBs based on perturbed parameter ensembles of a subset of scenarios from the IPCC AR5 Scenario Database (hosted at the International Institute for Applied Systems Analysis – IIASA, and available at https://secure.iiasa.ac.at/web-apps/ene/AR5DB/).

The results of a TEB approach are most useful if the warming due to non-CO<sub>2</sub> forcing as a function of cumulative CO<sub>2</sub> emissions is similar across scenarios, meaning that the conclusions are not strongly dependent on the scenario chosen. However, Figure 3a shows that there is quite a large variation in non-CO<sub>2</sub> forcing for a given level of cumulative CO<sub>2</sub> emissions when looking at all scenarios available in the IPCC AR5 Scenario Database. Caution is therefore advised when deriving carbon budgets based on one single multi-gas scenario (see more below). Finally, the use of TEBs for limiting warming to below a given temperature limit, assumes that non-CO<sub>2</sub> warming never increases beyond the level it reached at the time the TEB was computed (see Figure 2). Also non-CO<sub>2</sub> forcing thus needs to be kept within limits over time.

## Threshold avoidance budgets

Carbon budgets defined in the previous section are derived at the time a given scenario exceeds a specific temperature threshold or limit. A complementary approach is to consider multiple emission scenarios and evaluate carbon budgets for the subset of scenarios that avoid crossing such a threshold with a given probability. We name these budgets *threshold avoidance budgets* (TAB, see Table 1). Because, by definition, such scenarios do not exceed the limit of interest at any specific point in time (with a given probability), a time horizon needs to be defined until when a budget is computed. This time horizon can either be a predefined period, for example the 2011-2050 or the 2011-2100 period, or more variable in nature, for example the time period until peak warming (see yellow scenario in Figure 2). Both of these approaches were used in the IPCC AR5, and more sophisticated approaches based on the TAB methodology have been used in the literature<sup>7</sup>.

IPCC Working Group III (WGIII) computed TABs for the periods 2011-2050 and 2011-2100, by assessing the probabilistic temperature projections in  $2100^{34,35}$ . For this, WGIII categorized a large number of scenarios based on end-of-century  $CO_2$ -equivalent concentrations. The reported TAB values – for example, in Table 6.3 in the WGIII Report<sup>35</sup> or Table SPM.1 in the Synthesis Report<sup>33,34</sup> (SYR) – are therefore the result of an assessment of the exceedance probability outcomes found in each of the  $CO_2$ -equivalent concentration categories. Alternatively, scenarios could have been categorised on the basis of median temperature, probabilities to limit warming to below a specific temperature limit, or even carbon budgets. For scenarios that limit end-of-century warming to below

 $2^{\circ}$ C with a 'likely' probability (greater than 66% chance), the IPCC AR5 WGIII assessment<sup>34</sup> reports that the TABs in terms of cumulative CO<sub>2</sub> emissions in the periods 2011-2050 and 2011-2100 are 150-1300 GtCO<sub>2</sub> and 630-1180 GtCO<sub>2</sub>, respectively.

In the IPCC SYR<sup>33</sup> TABs are also computed based on the scenarios available in the IPCC AR5 Scenario Database – see Table 2.2 in Ref. 33. However, the SYR categorizes scenarios directly based on their probability of keeping peak warming to below a specific temperature threshold (1.5°C, 2°C, or 3°C) during the  $21^{st}$  century. For example, the IPCC SYR reports TABs for limiting warming to below 2°C with at least 66% chance of 2550-3150 GtCO<sub>2</sub> from 1870 until peak warming.

#### The numbers compared

To understand what the different approaches mean in terms of the actual values of carbon budgets, we compare the available budgets related to the 2°C limit. Table 2 provides an overview for all the numbers discussed in this section, relative to two common base years (2011 and 2015). Taking into account that about 2050 GtCO<sub>2</sub> (ca. 560 PgC) of CO<sub>2</sub> had already been emitted by the end of 2014 (Ref. 36), a CO<sub>2</sub>-only budget approach would indicate that 1620 GtCO<sub>2</sub> (or 440 PgC) remain to have a >66% probability of limiting warming to below 2°C relative to preindustrial levels (here defined as the 1861-1880 period<sup>26</sup>). Using a TEB approach and assuming non-CO<sub>2</sub> forcing as in RCP8.5, this amount is reduced to 850 GtCO<sub>2</sub> (or 230 PgC). When assessed with the latter approach, a 1620 GtCO<sub>2</sub> budget would limit warming to below 2°C in less than 33% of the available models (Ref. 42).

It is worth noting that the IPCC assessment of the  $CO_2$ -only budget is based on an assessed uncertainty range of TCRE, drawing upon many lines of evidence. The IPCC WGI numbers including non- $CO_2$  forcing are based on CMIP5 simulations of the response to RCPs, which – although being a valid approach – provide a narrower scientific basis. At least for the four RCPs used by WGI, a similar warming as a function of cumulative  $CO_2$  emissions is found (see Figure TFE.8 in Ref. 42), despite having different non- $CO_2$  evolutions (see Figure 3a). This counterintuitive result is explained further below.

When extensively varying the non-CO<sub>2</sub> assumptions for TEBs using a subset of baseline and weak mitigation scenarios from the IPCC AR5 Scenario Database (which all exceed the 2°C limit), a range of 850-1550 GtCO<sub>2</sub> (5<sup>th</sup>-95<sup>th</sup> percentile range across all TEB scenarios, from 2015 onward) is associated with limiting warming to below 2°C with 66% probability<sup>36</sup>. The difference between this range and the 850 GtCO<sub>2</sub> number quoted above is, on the one hand, caused by the different modelling frameworks and, on the other hand, by the fact that the non-CO<sub>2</sub> forcing evolution of RCP8.5 is situated amongst the highest percentiles of the non-CO<sub>2</sub> forcing in other high emission scenarios that exceed the 2°C threshold (see Figure 3).

When considering TAB until peak warming, based on the stringent mitigation scenarios of the IPCC AR5 Scenario Database, a range of  $590\text{-}1240~\text{GtCO}_2$  is found for limiting warming to below 2°C with >66% probability<sup>33</sup> ( $10^{\text{th}}\text{-}90^{\text{th}}$  percentile range, as reported by IPCC WGIII, from 2015 onward). Finally, for TAB calculated over the 2015-2100 period, an assessment of the stringent mitigation scenarios available in the IPCC AR5 Scenario Database and their temperature outcomes results in a range of  $470\text{-}1020~\text{GtCO}_2$  ( $10^{\text{th}}\text{-}90^{\text{th}}$  percentile range) for limiting warming to below 2°C with a 'likely' (greater than 66%) chance<sup>35</sup>.

In conclusion, moving from a  $CO_2$ -only budget<sup>42</sup> to a multi-gas multi-scenario TEB budget<sup>36</sup> removes around 420 GtCO<sub>2</sub> (i.e., the average of the 70-770 GtCO<sub>2</sub> range) from the  $CO_2$  budget from 2015 onward for limiting warming to below 2°C with 66% chance. Subsequently moving to a TAB budget until peak warming<sup>33</sup> or over the 2015-2100 period<sup>35</sup> and a >66% chance would additionally remove about 260-310 GtCO<sub>2</sub> and 380-530 GtCO<sub>2</sub>, respectively. (Note that these values are illustrative as they are obtained by comparing ranges which are defined in different ways.)

In conclusion, the TAB range for limiting warming to below  $2^{\circ}$ C with greater than 66% probability of 470-1020 GtCO<sub>2</sub> for the 2015-2100 period is thus 35 to 70% below what would have been inferred from a CO<sub>2</sub>-only budget with a TEB approach.

#### Strengths and limitations

The various approaches to computing carbon budgets each come with their respective strengths and limitations. Understanding what can lead to possible differences in budget estimates is critical to avoid misinterpretation of the numbers.

The budget type definition, the underlying data and modelling, the scenario selection, temperature response timescales and the accompanying pathway of CO<sub>2</sub> and non-CO<sub>2</sub> emissions are identified as possible key drivers of the difference between the various budget options discussed above.

That the **budget type definition** will have an influence on the resulting numbers is almost trivial. For example, when defining TABs from 2011 to 2100 instead of until peak warming, the cumulated net negative emissions which can be achieved until the end of the century will lead to consistently lower 2015-2100 TABs compared to TABs defined until peak-warming levels. Negative emissions occur when carbon dioxide is actively removed from instead of emitted into the atmosphere by human activities. For instance, for TABs compatible with limiting warming to below 2°C with >66% chance, the difference between TABs defined until peak warming and over the 2015-2100 period would be of the order of 120-220 GtCO<sub>2</sub>. Furthermore, the budget type definition also influences other factors, like scenario selection, whose impact on the carbon budget is explained in more detail below.

### Underlying data and modelling

Some of the differences between the quantitative budgets estimates are simply driven by differences in the underlying data and models. In general, these differences apply to TEB and TAB alike. For example, while the WGI CO<sub>2</sub>-only budget is based on the interpretation of an assessed uncertainty range, the other TEB and TAB budgets were computed either from CMIP5 RCP results (in the WGI Report and the SYR) or from a simple climate model (MAGICC) in a probabilistic setup<sup>7,23,24</sup> (in the WGII Report and the SYR).

Budget estimates can differ depending on whether a single-scenario multi-model ensemble is used (for example, all CMIP5 runs for RCP8.5) or alternatively a single-model multi-scenario perturbed parameter ensemble is used (for example, the IPCC AR5 WGIII approach which uses MAGICC). The former approach allows us to use information from a wide range of the most sophisticated models and incorporate state-of-the-art Earth-system interactions in the budget assessment. However, this approach comes at a high computational cost, resulting in only a limited ensemble of opportunity of model runs being available for any assessment. The latter method, on the other hand, uses a much simpler model, and hence comes with great computational efficiency which allows for hundreds if not thousands of realisations per scenario. This allows variations in scenario assumptions on the pathways and evolution of non-CO<sub>2</sub> forcing over time to be explored in more detail.

These differences in the underlying data and modelling can result in changes in the budget estimates. However, while a simple climate model does not provide the detail of ESMs, it can closely emulate their global-mean behaviour<sup>43</sup> and can represent the uncertainties in carbon-cycle and climate response in line with the assessment of the IPCC AR5 (Refs. 7,24,44). Of importance here is that the MAGICC setup applied in WGIII and the SYR is consistent with the CMIP5 ensemble for temperature projections and TCRE (Figure 12.8 in Ref. 15, and Figure 6.12 in Ref. 35). It is therefore expected that these differences are limited.

A final aspect related to the data and modelling is the interpretation of the nature of the uncertainties that accompany the various data. Uncertainty ranges can be the expression of a variety of underlying uncertainty sources<sup>45</sup>, and they can be interpreted in different ways. In the context of the quantification of carbon budgets, at least three kinds of uncertainty ranges can be distinguished: (1) an uncertainty range resulting from an in-depth assessment of multiple lines of evidence (a so-called assessed uncertainty range); (2) an uncertainty range emerging from a sophisticated statistical sampling of the parameter space or; (3) an uncertainty range which represents the spread across an arbitrary collection of model results (a so-called ensemble of opportunity). Each of these uncertainty ranges can be interpreted in different ways, and they decline in robustness going from an assessed uncertainty range over targeted statistical approaches to ensembles of opportunities. These aspects

thus also influence the robustness of any carbon budget estimates based on them. For example, the budget for CO<sub>2</sub>-induced warming from WGI is derived from an assessed uncertainty range, while the WGI budgets that additionally take into account non-CO<sub>2</sub> forcing are based on an ensemble of opportunity, which makes them much less robust (see also Technical Focus Element 8 in Ref. 42).

#### Scenario selection

Applying the definition of TEB and TAB budgets to a large scenario ensemble for the assessment of CO<sub>2</sub> budgets in line with a particular temperature limit results in the selection of two disjoint subsets of emission scenarios: a subset of baseline and weak mitigation scenarios that exceed the temperature limit with a given probability in case of TEB budgets, and a disjoint subset of more stringent to very stringent mitigation scenarios that all keep warming to below the specified temperature limit with a given probability in case of TAB budgets.

A first implication of the use of these disjoint scenario sets results from only very few scenarios being available that have, for example, precisely a 66% probability for limiting warming to below a given temperature threshold. While TEBs are consistently computed for each scenario at the time a scenario exceeds a temperature limit with a given probability, the value of TABs is further driven by the choice of the range of probabilities that is used to select appropriate TAB scenarios. For example, the IPCC SYR selected all scenarios that have a 66 to 100% probability of limiting warming to below a given threshold (compared to exactly 66% for TEB). This resulted in an average probability of staying below 2°C across the subset of TAB scenarios that comply with the abovementioned selection criterion of about 75%. This can explain about one third to half of the 260-310 GtCO<sub>2</sub> difference between the TEB estimates from Friedlingstein *et al.* (Ref. 36) and the IPCC SYR TAB estimates.

Moreover, for some temperature levels, for example around 3°C, the scenarios available in the IPCC AR5 Scenario Database do not sample the possible range extensively, which can lead to additional biases in the numbers obtained.

## Temperature response timescales

A second aspect that is different in the disjoint scenario subsets are the  $CO_2$  emission pathways and hence the annual  $CO_2$  emissions at the time the compatible carbon budget is derived. In the TAB subset,  $CO_2$  emissions will typically approach zero or become negative in order to stabilize global temperatures, and will thus be very low at the time of maximum warming during the  $21^{st}$  century. In the TEB subset this is not the case. Because of the timescales of  $CO_2$ -induced warming  $^{46,47}$  this leads to differences in the carbon budget estimates.

Recent research indicates that, at current emission rates, maximum  $CO_2$ -induced warming only occurs about a decade after a  $CO_2$  emission <sup>46,47</sup>. Thus, even in a  $CO_2$ -only world, TABs and TEBs with

complementary probabilities (for example, a 66% probability to limit warming below 2°C and a 34% probability to exceed 2°C) would not be entirely identical. In case of the TEB approach, the maximum warming of the CO<sub>2</sub> emissions of the last decade before the temperature limit was exceeded has possibly not yet fully occurred. In a TAB approach the emissions in the last decade would be significantly lower, if not zero, and this would allow a much larger fraction of the warming to already be realized. The TEB approach thus leads to a consistent overestimate of the CO<sub>2</sub> budget compatible with a given temperature limit, while this is not the case with the TAB approach. At least one third of the approximately 260-310 GtCO<sub>2</sub> difference between the TEB estimates from Ref. 36 and the IPCC SYR TAB estimates can be explained by accounting for the approximately one decade delay between CO<sub>2</sub> emissions and their maximum warming.

## Non-CO<sub>2</sub> warming contribution

A third and last aspect that differs between the two disjoint TEB and TAB scenario subsets is the mixture of CO<sub>2</sub> and non-CO<sub>2</sub> forcers. This mixture differs over time and therefore, depending on when the compatible carbon budget is determined, the TAB and TEB are derived under possibly very different non-CO<sub>2</sub> forcing (see Figure 3b). The relationship between CO<sub>2</sub> emissions and non-CO<sub>2</sub> forcing is complex, as it covers the total non-CO<sub>2</sub> forcing which results from both positive and negative climate forcers. Climate policy influences these non-CO<sub>2</sub> forcers both directly (via abatement measures) and indirectly (via changes induced in the energy system), which is captured in different ways in IAMs. For example, stabilizing and peaking global temperatures requires global CO2 emissions to be reduced to close to net zero. Such very low CO<sub>2</sub> emissions are achieved through a fundamental transformation of the global energy-economy-land system<sup>35</sup>, which in turn leads to changes in non-CO<sub>2</sub> emissions because of the phase-out of common sources of CO<sub>2</sub> and non-CO<sub>2</sub> emissions<sup>14,48</sup>. This can lead to important differences in non-CO<sub>2</sub> forcing as a function of total cumulative CO<sub>2</sub> emissions (Figure 3a). Figure 3b shows that median non-CO<sub>2</sub> forcing at the time which is of importance for deriving the carbon budget (i.e., the time of exceedance for TEBs, and peak warming for TABs) is about 0.2 W/m<sup>2</sup> higher in the subset of scenarios used for TEBs compared to the subset used for TABs.

However, the non-CO<sub>2</sub> forcing at either peak warming or the time of exceeding a given temperature threshold does not tell the entire story. When estimating the actual non-CO<sub>2</sub>-induced warming at these time points of interest (see Box 1 on 'Non-CO<sub>2</sub> temperature contributions'), very little difference can be found between the TEB and TAB scenario subsets (Figure 3c). This thus suggests that, when a sufficiently large scenario sample is available, variations in non-CO<sub>2</sub> forcing cannot be used to explain the variations between TEB and TAB estimates for limiting warming to below 2°C. The precise influence of this difference on the carbon budgets has not been quantified.

Incidentally, this feature is not obviously visible when looking at the four RCPs only, because both the lowest, RCP2.6, and the highest, RCP8.5, are outliers in terms of non-CO<sub>2</sub> warming, at opposite sides of the scenario distribution (Figures 3b-c).

Finally, while non-CO<sub>2</sub> forcing does not provide a strong explanation for the variations between TEB and TAB estimates, it plays an important role for the variation within the TEB and TAB subsets. Figure 3d shows that respectively 70% and 50% of the variance within the TEB and TAB subsets can be explained by non-CO<sub>2</sub> warming at the time of determining the carbon budget.

Future non-CO<sub>2</sub> warming under stringent mitigation remains nonetheless very uncertain at present. Its magnitude will depend on the extent to which society will be successful in bringing about assumed future improvements in agricultural yields and practices or dietary changes<sup>49</sup>, amongst many other factors. These are very uncertain. Furthermore, how much non-CO<sub>2</sub> forcing is reduced compared to CO<sub>2</sub> depends on the relative weight that is given to CO<sub>2</sub> and non-CO<sub>2</sub> emissions in mitigation scenarios, and also on other mitigation choices<sup>50</sup>. These weights are mostly constant in IAMs (for example, by using global warming potentials as a fixed exchange rate), but can also change over time and depend on the question posed.

Air pollution controls can influence the rate of near-term warming and, depending on the precise mix of air pollutants that is reduced by air pollution controls, non-CO<sub>2</sub> warming can be increased, decreased or stay constant<sup>14</sup>. The estimated effect of air pollution controls on carbon budgets, in particular on TABs, is very small<sup>51</sup>. This is important information for policy-making, as it can be used to consider trade-offs between the uncertainty in non-CO<sub>2</sub> mitigation, possibly larger CO<sub>2</sub> budgets, and a larger amount of committed warming at the multi-century scale due to larger cumulative CO<sub>2</sub> emissions.

#### **Applicability**

Earlier we indicated that budgets that only take into account CO<sub>2</sub>-induced warming are scientifically best understood as – per definition – they do not depend on additional uncertainties associated with other forcings. However, at the same they are impractical and largely irrelevant for use in the real world, because of their obvious limitation of neglecting any contribution that is different from CO<sub>2</sub>. The other approaches that go beyond this CO<sub>2</sub>-only approach, might therefore be more practical. Using a CO<sub>2</sub>-only approach estimate for real-word decision-making would lead to an overestimation of the allowable carbon budget, i.e. a very high risk of exceeding a given climate target when emitting that particular carbon budget.

The strength of TEBs is that they are easily comparable to TCRE-based budgets for  $CO_2$ -induced warming only. Hence the influence of non- $CO_2$  forcing on the size of carbon budgets can be assessed.

However, because of the limitations related to scenario selection (TEBs are derived from scenarios that fail in limiting warming to the temperature level of interest) and the timescales of the temperature response, TABs are preferred over TEBs. The strength of TABs lies exactly in their use of scenarios that represent our best understanding of how  $CO_2$  and other radiatively active species would evolve over time when  $CO_2$  emissions are stringently reduced.

#### **Conclusions**

Several possibilities are available to compute cumulative carbon budgets consistent with a particular temperature limit. We have shown that each of the  $CO_2$  budget approaches has strengths but also comes with important limitations. The devil is in the detail here. The most scientifically robust number – the budget for  $CO_2$ -induced warming – is also the least practical in the real world. Selecting budgets based on multi-gas emission scenarios that actually restrict warming to below a given temperature threshold, results in the lowest, but most relevant  $CO_2$  emission budgets in a real-world multi-gas setting. Any practical implementation of a carbon budget mitigation strategy would require parallel mitigation efforts for non- $CO_2$  agents.

At the time of the IPCC AR5, no established methodologies were available to ensure easy comparability of carbon budget estimates across working groups. In hindsight and anticipating future assessments, three recommendations can be formulated. First, insofar important topics can already be identified, coordinated model simulations, intercomparisons, and methods could be initiated at an early stage to ensure consistency and traceability. Second, consistency across – and collaboration and integration between – the IPCC working groups could be improved by setting up stronger ties between them. And third, IPCC reports should be clearer about the policy-applicability of the numbers they provide, without being policy prescriptive.

For limiting warming to below 2°C relative to preindustrial levels with greater than 66% probability, the remaining CO<sub>2</sub> budget from 2015 onwards for CO<sub>2</sub>-induced warming only is 1620 GtCO<sub>2</sub>. The corresponding TAB budget would be 590-1240 GtCO<sub>2</sub>. The latter is equivalent to about 15 to 30 years of CO<sub>2</sub> emission at current (2014) levels (about 40 GtCO<sub>2</sub>/yr, Ref. 52). No matter which approach is taken, the CO<sub>2</sub> budget for keeping warming to below 2°C always implies stringent emission reductions over the coming decades and net zero CO<sub>2</sub> emissions in the long term. For policymaking in the context of the UNFCCC, we suggest using the 590-1240 GtCO<sub>2</sub> estimate from 2015 onward, as this is derived from an assessment of scenarios that effectively limit warming to below the 2°C limit.

# **BOX 1: Non-CO<sub>2</sub> temperature contributions**

The estimated temperature contributions of non-CO<sub>2</sub> forcing, shown in Figure 3c, are derived by the following equation, as described in the Supplementary Material to the IPCC AR5 Working Group I Chapter on 'Anthropogenic and Natural Radiative Forcing'<sup>53</sup> (equation 8.SM.13).

$$R_T(t) = \sum\nolimits_{j=1}^{M} \frac{c_j}{d_j} exp\left(-\frac{t}{d_j}\right)$$

Where  $R_T$  is the climate response to a unit of forcing,  $c_j$  the component of the climate sensitivity,  $d_j$  the response times, and t the time. For the two-term approximation (M=2) presented by Ref. 54, values of  $c_1$ ,  $c_2$ ,  $d_1$ , and  $d_2$  are taken from Table 8.SM.9 in Ref. 53. This estimate is to be considered an illustrative approximation of the non-CO<sub>2</sub> forcing's temperature effect.

# **END BOX 1**

#### Figure captions:

Figure 1 | Proportionality of global-mean temperature increase to cumulative emissions of CO<sub>2</sub>.
Four CO<sub>2</sub> emission pathways with identical cumulative carbon emissions over the 21<sup>st</sup> century (panel a) and their corresponding temperature projections (panel b). The grey area in panel b shows the central 66 percent uncertainty range of temperature projections around the thick purple line. Panels are adapted from Figure 12.46 in Ref. 15.

Figure 2 | Illustration of the approach to compute threshold exceedance budgets (TEB) versus threshold avoidance budgets (TAB). In a first step (arrows labelled "1"), temperature outcomes are computed from multi-gas emission scenarios which either exceed (orange) or avoid (yellow) a given temperature threshold. Based on either the timing of exceeding the chosen threshold or the timing of peak warming, carbon budgets compatible with the chosen temperature threshold are computed in a second step (arrow labelled "2") by summing the carbon emissions of the underlying scenarios until the timing of exceeding the threshold or peak warming for TEB or TAB (arrow labelled "3"), respectively.

Figure 3 | Non-CO<sub>2</sub> forcing and cumulative CO<sub>2</sub> emissions. a, Non-CO<sub>2</sub> forcing as a function of cumulative CO<sub>2</sub> emissions from 2015 onwards for scenarios of the IPCC AR5 Scenario Database. Scenarios are split up into two subsets: (1) scenarios that limit warming to below 2°C relative to preindustrial with at least 66% probability (yellow-mustard, used for TAB) and (2) scenarios that lead to global-mean temperatures exceeding the 2°C relative to preindustrial limit with at least 34% (orange, used for TEB). b, Distribution of non-CO<sub>2</sub> forcing at the time point critical for deriving TEB (orange) and TAB (yellow-mustard) budgets, i.e., the moment the 2°C limit is exceeded for TEBs and peak warming for TABs. c, Distribution of the estimated temperature contribution from non-CO<sub>2</sub> forcing at the same time point as in panel b (see Box 1 on 'Non-CO<sub>2</sub> temperature contributions'). The four RCPs are also included for comparison. d, Variation within the TEB and TAB budget subsets as a function of the estimated temperature contribution from non-CO<sub>2</sub> forcing as in panel c. Numerical values in panel d are R<sup>2</sup> values for the two linear fits.

# Tables:

Table 1 | Three different types of carbon budgets and their definition

Carbon budget type	Abbreviation	Definition and description
Budget for CO <sub>2</sub> -	CO <sub>2</sub> -only	Amount of cumulative carbon emissions that are compatible with
induced warming	budget	limiting warming to below a specific temperature threshold with a
		given probability in the hypothetical case that CO <sub>2</sub> is the only source
		of anthropogenic radiative forcing. This budget can be inferred from
		the assessed range of TCRE.
Threshold	TEB	Amount of cumulative carbon emissions at the time a specific
Exceedance Budget		temperature threshold is exceeded with a given probability in a
		particular multi-gas emission scenarios. This budget thus takes into
		account the impact of non-CO <sub>2</sub> warming at the time of exceeding the
		threshold of interest.
Threshold	TAB	Amount of cumulative carbon emissions over a given time period of a
Avoidance Budget		multi-gas emission scenario that limits global-mean temperature
		increase to below a specific threshold with a given probability. This
		budget thus takes into account the impact of non-CO <sub>2</sub> warming at
		peak global-mean warming, which is approximately the time global
		CO <sub>2</sub> emissions become zero and global-mean temperature is
		stabilized.

Table 2 | Selection of carbon emission budgets related to a global temperature limit of 2°C relative to preindustrial levels from various sources. 1890 GtCO<sub>2</sub> were already emitted by 2011, and about 2050 GtCO<sub>2</sub> by 2015. All values are in GtCO<sub>2</sub>, reported from 2011 and 2015 onwards, and rounded to the nearest 10. Budget types are defined in Table 1.

Source	Туре	Specification	Value since 2011	Value since 2015
IPCC AR5	CO <sub>2</sub> -	To limit warming to less than 2°C since the	1780	1620
WGI only		period 1861-1880 with greater than 66% (or	(or 2550)	(or 2390)
budget	50%) probability		. ,	
IPCC AR5	TEB	To limit warming to less than 2°C since the	1010	850
WGI		period 1861-1880 in more than 66% (or 50%) of	(or 1120)	(or 960)
		the model runs when accounting for the non-CO <sub>2</sub>		
		forcing as in the RCP scenarios		
IPCC AR5	TAB	To limit warming in 2100 to below 2°C since	630 to	470 to
WGIII		1850-1900 with a 'likely' (>66%) probability,	1180	1020
		accounting for the non-CO <sub>2</sub> forcing as spanned		
		by the subset of stringent mitigation scenarios in		
		the IPCC AR5 Scenario Database*. (10%-90%		
		range over scenarios in IPCC WGIII scenario		
		category 1)		
IPCC AR5	TAB	To limit warming in 2100 to below 2°C since	960 to	800 to
WGIII		1850-1900 with a 'more likely than not' (>50%)	1430	1270
		probability, accounting for the non-CO <sub>2</sub> forcing		
		as spanned by the subset of stringent mitigation		
		scenarios in the IPCC AR5 Scenario Database*.		
		(10%-90% range over scenarios in IPCC AR5		
		scenario category II without overshoot)		
IPCC AR5 SYR	TEB	To limit warming to less than 2°C since the	1010	850
		period 1861-1880 in more than 66% (or 50% or	(1110 or	(960 or
		33%) of the model runs of the CMIP5 RCP8.5	1410)	1250)
		ESM and EMIC simulations. (These correspond to		
		the IPCC AR5 WGI TEB budgets reported above)		
IPCC AR5 SYR	TAB	To limit warming to below 2°C since 1861-1880	750 to	590 to
		with 66-100% probability, accounting for the	1400	1240
		non-CO <sub>2</sub> forcing as spanned by the subset of		
		stringent mitigation scenarios in the IPCC AR5		
		Scenario Database. (10%-90% range)		
IPCC AR5 SYR	TAB	To limit warming to below 2°C since 1861-1880	1150 to	990 to
		with 50-66% probability, accounting for the non-	1400	1240
		CO <sub>2</sub> forcing as spanned by the subset of stringent		
		mitigation scenarios in the IPCC AR5 Scenario		
		Database. (10%-90% range)		
Friedlingstein	TEB	To limit warming to less than 2°C since 1850-	1310	1150
et al. (2014)		1900 with a 66% probability, accounting for the	(1010 to	(850 to
		non-CO <sub>2</sub> forcing as spanned by the subset of	1710)	1550)
		baseline and weak mitigation scenarios in the		
		IPCC AR5 Scenario Database*. (5%-95% range)		
Friedlingstein	TEB	To limit warming to less than 2°C since 1850-	1610	1450
et al. (2014)		1900 with a 50% probability, accounting for the	(1210 to	(1050 to
. ,		non-CO <sub>2</sub> forcing as spanned by the subset of	2010)	1850)
		baseline and weak mitigation scenarios in the	-	•
		IPCC AR5 Scenario Database*. (5%-95% range)		
*· The tempera	ture differ	ence between the 1861-1880 and 1850-1900 is 0.02	°C hased on Ref	: 55

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# **Author Contributions**

All authors contributed to the underlying research during the writing process of the IPCC AR5. JR coordinated the conception and the writing of the paper. JR carried out the research with significant contributions from MS, and developed the TEB and TAB conceptual framework. JR produced the figures and wrote the first draft of the manuscript. All authors contributed to interpreting and discussing the results, and writing the paper.





