REVIEW

Terrestrial Carbon Cycle Variability [version 1; referees: 2 approved]

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Abstract

A growing literature is reporting on how the terrestrial carbon cycle is experiencing year-to-year variability because of climate anomalies and trends caused by global change. As CO₂ concentration records in the atmosphere exceed 50 years and as satellite records reach over 30 years in length, we are becoming better able to address carbon cycle variability and trends. Here we review how variable the carbon cycle is, how large the trends in its gross and net fluxes are, and how well the signal can be separated from noise. We explore mechanisms that explain year-to-year variability and trends by deconstructing the global carbon budget.

The CO₂ concentration record is detecting a significant increase in the seasonal amplitude between 1958 and now. Inferential methods provide a variety of explanations for this result, but a conclusive attribution remains elusive. Scientists have reported that this trend is a consequence of the greening of the biosphere, stronger northern latitude photosynthesis, more photosynthesis by semi-arid ecosystems, agriculture and the green revolution, tropical temperature anomalies, or increased winter respiration.

At the global scale, variability in the terrestrial carbon cycle can be due to changes in constituent fluxes, gross primary productivity, plant respiration and heterotrophic (microbial) respiration, and losses due to fire, land use change, soil erosion, or harvesting. It remains controversial whether or not there is a significant trend in global primary productivity (due to rising CO₂, temperature, nitrogen deposition, changing land use, and preponderance of wet and dry regions). The degree to which year-to-year variability in temperature and precipitation anomalies affect global primary productivity also remains uncertain. For perspective, interannual variability in global gross primary productivity is relatively small (on the order of 2 Pg-C y⁻¹) with respect to a large and uncertain background (123 +/- 4 Pg-C y⁻¹), and detected trends in global primary productivity are even smaller (33 Tg-C y⁻²). Yet residual carbon balance methods infer that the terrestrial biosphere is experiencing a significant and growing carbon sink. Possible explanations for this large and growing net land sink include roles of land use change and greening of the land, regional enhancement of photosynthesis, and down regulation of plant and soil respiration with warming temperatures. Longer time series of variables needed to provide top-down and bottom-up assessments of the carbon cycle are
needed to resolve these pressing and unresolved issues regarding how, why, and at what rates gross and net carbon fluxes are changing.
Introduction
In today’s world, CO₂ concentrations have risen beyond 400 ppm, a level not experienced over the past 800,000 years. This rise in atmospheric CO₂ is mostly due to fossil fuel emissions and is largely responsible for a 1.5°C increase in air temperatures over land since the 1880s. Together, rising CO₂ concentrations and temperatures are causing the carbon cycle to experience greater year-to-year perturbations and trends than those experienced during the past deglaciation events.

Today, the constituent fluxes and pools of the terrestrial carbon cycle are widely out of equilibrium from pre-historical conditions owing to human activities. For perspective, atmospheric CO₂ increased from about 180 to 280 ppm since the last glacial period, adding about 220 Pg-C to the atmosphere over a 10,000-year period; this pre-industrial change was associated with a positive trend in the net global carbon exchange rate of about 20 Tg-C y⁻¹. In comparison, atmospheric CO₂ is increasing at a rate of about 4.4 Pg-C y⁻¹, as fossil fuel and cement production release 9 +/- 0.5 Pg-C y⁻¹, land use change releases 0.9 +/- 0.5 Pg-C y⁻¹, and terrestrial ecosystems assimilate 3 +/- 0.5 Pg-C y⁻¹.

Net carbon exchange by terrestrial ecosystems is expected to be variable and changing in our warming and CO₂-enriched world. This expectation is based on the fact that the rates of photosynthesis are tied to CO₂ and temperature and that respiration is tied to temperature, photosynthesis, and the size of the carbon pools. From first principles, we know that photosynthesis will increase with CO₂ concentrations in a diminishing returns fashion, defined by Michaelis-Menten reactions associated with the carboxylation reactions between CO₂ and ribulose biphosphate. In addition, increased temperatures accelerate kinetic rates of enzyme reactions, thereby increasing mitochondrial respiration of plants and microbes.

On a year-to-year basis, the secular warming of the Earth’s climate is causing different regions of the world to experience episodes of extremes such as wetness, dryness, hot, and cold, which can perturb the fluxes of carbon to and from the plants and soils of those regions. And, on annual to decadal time scales, changes in land use, phenology, greenness of the biosphere, fires, and nitrogen deposition are introducing additional variability and trends on components of the carbon cycle.

How variable is the carbon cycle?
To answer this question with confidence, we have to separate trends and induced variability from natural variability and random sampling errors. We are entering an era where the sampling record is starting to be long enough to separate signal from noise. We have a 50-year record of CO₂ concentrations in the atmosphere, providing a top-down constraint on carbon cycle variability, and we have a 30-year satellite record, giving us bottom-up information on spatial/temporal variability of the greening of the land. Consequently, there has been growing activity to quantify and understand variability of the carbon cycle based on these longer global-scale records. The objective of this review is to survey key literature on the variability of the terrestrial carbon cycle at the global scale published over the past 4+ years (2012 into 2016).

To assess any attribution in the variability of the terrestrial carbon cycle, one must consider the degree of differential and induced modulations of its three major carbon pools. The vegetation, soil, and atmosphere carbon pools have different sizes, different turnover times, and different responses to environmental perturbations, like light, CO₂ concentration, temperature, and soil moisture. In other words, there is a disequilibrium between the gains and losses of carbon to and from the plant and soil pools, which can partly be explained by the relatively fast way CO₂ enters the biosphere via photosynthesis and the relatively slow way it leaves via plant, root, and soil respiration. Consequently, these carbon pools have different susceptibility to anomalous weather and climate variability at global and regional scales. Furthermore, the variability of carbon fluxes is dependent upon changes in such ecological factors as plant functional type, leaf area index, time since disturbance and stand age, nitrogen loading, the intensity and frequency of fires, soil erosion, and transport as dissolved carbon.

Given the superposition of natural (by weather and fire) and human-induced variability (by climate change, increasing CO₂, changing land use, changing forest age distributions, pollution, and nitrogen deposition) on the carbon cycle, can we detect signals or responses among simultaneous variation of numerous drivers? Secondly, are the short-term changes in carbon pools large enough to detect with current observation systems? In assessing if variability in the carbon cycle is occurring, we must consider the detection limit and sampling errors of these systems as they affect how precise or accurate they are.

One group of scientists has reported that the amplitude of the seasonal swing in atmospheric CO₂ is growing. To illustrate this point, we show publicly available data from the long-term monitoring station at Mauna Loa, Hawaii (Figure 1). This figure shows that the magnitude of the difference between the maximum and minimum values of CO₂ concentration for each year, after the time series was detrended with a moving filter, has increased by nearly 15% over 55 years. When the global fields of CO₂, from a network of CO₂ sampling sites, are considered, it has been deduced that the annual global carbon uptake doubled from 2.46 to 5.06 Pg-C y⁻¹ between 1960 and 2010, a rate of 52 Tg-C y⁻¹.

What is the explanation for this temporal increase in CO₂ amplitude? The answers are manifold. Scientists have reported that this trend is a consequence of the greening of the biosphere, stronger northern latitude photosynthesis, more photosynthesis by semiarid ecosystems, agriculture and the green revolution, tropical temperature anomalies, or increased winter respiration.

Evidence for the greening of the terrestrial biosphere is provided by an analysis of satellite remote sensing data. The scientists report that seasonally integrated leaf area index is increasing across a quarter to one-half of the planet’s vegetated area, mostly to the CO₂ fertilization effect. Browning is detected too, but on only 4% of the vegetated land area.

Other scientists point to the northern latitudes, home of the world’s boreal forests, as the locale for a growing carbon sink. Graven et al. reported that a 30 to 60% change has occurred in the
carbon exchange of boreal forests. Forkel et al.\textsuperscript{15} lend support to this hypothesis by reporting that “the latitudinal gradient of the increasing CO\textsubscript{2} amplitude is mainly driven by positive trends in photosynthetic carbon uptake caused by recent climate change and mediated by changing vegetation cover in northern ecosystems”. Others claim winter conditions may have a strong influence on year-to-year variations in the growth of the CO\textsubscript{2} concentration amplitude. Yu et al.\textsuperscript{21} argue that warmer winters have less snow, which causes soil temperatures to be colder, reducing winter respiration. They conclude that this mechanism explains 25% of the enhancement of the carbon sink across boreal forests.

In addition, not all scientists agree on whether the activity of boreal forests explains the variability of the terrestrial carbon cycle. One team\textsuperscript{20} reported that 50% of the interannual variation of the CO\textsubscript{2} growth rate, between 1959 and 2011, was associated with tropical air temperature; a 1°C anomaly in tropical air temperature corresponded with a 3.5 +/- 0.6 Pg-C y\textsuperscript{-1} anomaly in the CO\textsubscript{2} growth rate. Others attribute the trends in the global carbon sink to the growth of semi-arid vegetation\textsuperscript{17,18}; semi-arid ecosystems are experiencing a 0.04 Pg-C y\textsuperscript{-2} trend in their carbon sink, which is about 57% of the global trend. Two other groups point to the role of agriculture as a modulating factor of the global CO\textsubscript{2} concentration record. Gray et al.\textsuperscript{16} and Zeng et al.\textsuperscript{19} attribute a significant part of the increase in the CO\textsubscript{2} seasonal amplitude (17 to 25%) to the agricultural green revolution; cereal production in the northern hemisphere increased by 240 percent over the 47-year period between 1961 and 2008, thereby increasing the net carbon uptake of crops by 0.33 Pg-C.

**Deconstructing the global carbon cycle**

To better understand how and why the terrestrial carbon cycle is experiencing variability, let’s examine the potential for modulation and or trends in the distinct plant and soil carbon pools.

**Global gross primary productivity**

The carbon cycle starts with the input of carbon through gross primary productivity. What is the value of global gross primary productivity? There is no single sensor or method to perform this assessment perfectly\textsuperscript{22}. Consequently, scientists are using networks of carbon flux measurements and meteorological stations with remote sensing and machine learning techniques to produce spatially resolved flux maps on monthly scales that can be summed to produce a global estimate\textsuperscript{23,24}. These empirically based, machine learning estimates of global gross primary productivity range from between 119 +/- 6 and 123 +/- 4 Pg-C y\textsuperscript{-1}.

Given this uncertainty, how variable is global gross primary production on a temporal basis? One could assume that, to a first order, global photosynthesis may experience little year-to-year variation at the global scale because it is primarily a function of solar radiation, and the solar constant is relatively stable at 1360 +/- 0.5 W m\textsuperscript{-2}.
Yet other studies beg to differ and report significant variation and trends in global photosynthesis. For example, a synthesis of 10 modeling approaches for assessing global gross primary productivity showed a range of between 112 and 169 Pg-C y⁻¹, a mean of 138 +/- 17 Pg-C y⁻¹, interannual variability on the order of 2.64 +/- 1.12 Pg-C y⁻¹, and a sensitivity of the long-term trend of 33 +/- 23 Tg-C y⁻²⁶,²⁷.

Temperature is bound to have different effects on photosynthesis on a regional basis. Piao et al.²⁷ report that global gross primary productivity has a negative relationship with temperature in the tropics and a positive relationship with temperature in the boreal regions owing to a longer growing season. At the global scale, they found that interannual variability in gross primary productivity is not correlated to its global temperature anomalies. Year-to-year variations in air temperature can also affect photosynthesis indirectly by its impact on phenology and the length of the growing season²⁷,²⁹. Emergent properties like the acclimation of photosynthesis to temperature must be considered too³⁰ when contemplating the change in gross primary productivity to warmer temperatures.

Regional drought can limit photosynthesis by causing physiological stress³¹,³². Integrating these drought effects globally, carbon cycle models reveal that average global gross primary productivity increases by 4.1 +/- 2 Pg-C y⁻¹ per 100 mm of precipitation³³. In humid tropical regions, moderate drought can enhance photosynthesis since it leads to reduced cloud cover and produces more incident sunlight³⁴.

Extreme climate events may have a disproportionate effect on global gross primary productivity. One study produced a 30-year record of the variability of global gross primary productivity using remote sensing data from a global flux network and a set of carbon cycle and dynamic vegetation models³⁵. The authors reported that a few extreme events explain most of the interannual variability in global gross primary productivity; 78% of the global anomaly in gross primary productivity is associated with 200 extreme events in the tenth percentile³⁶.

The examination in temporal trends in global gross primary productivity, inferred from long-term satellite records, has the potential to detect if the terrestrial biosphere is experiencing a response to rising CO₂ on global carbon assimilation. A new study³⁷ assessed the large divergence between satellite and Earth system models regarding the CO₂ fertilization effect on the carbon cycle. The authors found that net primary productivity derived from satellites increased by 2.8% from 1982 to 2011. In contrast, estimates of global net primary productivity, the difference between gross primary productivity and autotrophic respiration, derived by Earth system models increased by 7.6% over 30 years. Smith et al. conclude that Earth system models may be oversensitive to CO₂ effect if the satellite inferred method is correctly sampling the response of the biosphere to a secular increase in CO₂. A comment on the Smith et al. paper³⁸, however, points out that the satellite estimates used explicitly exclude the direct effect of CO₂ on gross primary production and suggests that the opposite conclusion is a more appropriate interpretation of the Smith et al. data: that remote sensing estimates likely underpredict the response of gross primary production to CO₂.

Another set of studies infer that long-term trends in global primary productivity may be emerging owing to enhancement by elevated carbon dioxide and fertilization by nitrogen deposition. Schimel et al.³³ asked, “what is the effect of rising CO₂ concentration on the carbon cycle?” They argued that theory predicts that the enhancement of photosynthesis by CO₂ should have a tropical maximum. They evaluated data over the 2000 to 2010 timeframe using nine process models. They concluded that there was significant tropical uptake. Their results suggest that up to 60% of the present-day terrestrial sink is caused by increasing atmospheric CO₂. As for hard numbers, they report that the best estimate of the tropical + southern CO₂ enhancement effect was a sink of -1.4 ± 0.4 Pg-C y⁻¹; negative values indicate a loss of carbon from the atmosphere and a gain by the biosphere. Such debates highlight the large unknowns that remain regarding how global photosynthesis is responding to changes in atmospheric CO₂.

Land use change can affect regional and global photosynthesis both positively and negatively. Land use change and rates of land use change affect the extent or direction of the change (deforestation or reforestation) in the green land area and the number of leaves intercepting photons³¹.

Questions remain as to the certainty of inferring small changes in global photosynthesis with confidence given the degree of measurement and sampling errors that are associated with upscaling photosynthesis to the global scale. One can estimate the 95% confidence interval that random trends in global gross primary productivity must exceed. We assumed that the uncertainty about global gross primary productivity with an empirical artificial neural network method³³ is on the order of +/- 4 Pg-C y⁻¹. Next, we drew a random population (n=1000) of a 30-year time series, about this error, using a Gaussian random number generator. We then fit linear regressions through each of these randomly probable trends and produced a histogram of their slopes (Figure 2). We found that trends in global gross primary productivity must have a slope exceeding +/- 5.3 Tg-C y⁻² to exceed the 95% confidence interval of the randomly sampled trends. If we assume the interannual uncertainty in global gross photosynthesis is on the order of 2.64 Pg-C y⁻¹, as shown, the 95% confidence interval of the slope is bound within +/- 3.4 Tg-C y⁻².

Clearly, more work and longer datasets are needed to resolve the contrasting conclusions derived from the satellite-based inferences and the model upscaling methods of global gross photosynthesis. New efforts are underway to produce independent estimates and constraints on global photosynthesis with sun-induced fluorescence³⁶ and to expand existing global networks of land-atmosphere CO₂ exchange, which should shed new light on this question³⁷.

Global respiration and oxidation losses

Photosynthesis is offset by plant and root respiration; these respiratory processes scale with temperature, soil moisture, and the physiological activity of plants. Trends or climatic anomalies in any of these biophysical variables have the potential to cause variations in plant respiration. How such anomalies scale globally depends on how well wet and dry and cool and hot climate anomalies average out globally and the degree to which climate
extremes may push non-linear responses\textsuperscript{9}. Other losses of plant material can arise through fire\textsuperscript{38}. Variations in carbon losses will be a function of fire area, intensity, and frequency\textsuperscript{38-40}. Regarding carbon lost from the soil, trends or anomalies in temperature, soil moisture, water table, and presence and absence of snow can modulate these effluxes\textsuperscript{21}. The potential for large carbon losses at regional scales can occur with the drying and thawing of the permafrost and drying of tropical peat forests.

\textbf{Other losses and gains: disturbances and regrowth}

On land, tropical forests are being lost, temperate forests are being regenerated, and semi-arid ecosystems burn periodically\textsuperscript{38}. Years with \textit{El Niño} have led to large fire emissions from southeast Asia, as drought allowed loggers into the normally flooded peat forests\textsuperscript{39}. Other losses of soil carbon can be attributed to erosion (0.3 to 1.0 Pg-C y\textsuperscript{-1})\textsuperscript{41} and transport to the oceans in the form of dissolved inorganic and organic carbon\textsuperscript{42}.

\textbf{Figure 2.} a) Trends in global gross primary production (GPP) of a 30-year-long time series derived from a population of random numbers that were sampled from a Gaussian distribution of +/- 4 Pg-C y\textsuperscript{-1} 1000 times; b) histogram and 95% confidence interval of the slopes derived from the populations of slopes computed in part a). The standard deviation is 0.0856 Pg-C y\textsuperscript{-2} and the 95% confidence interval is +/-5.3 Tg-C y\textsuperscript{-2}.
Net biome productivity

Net biome productivity (NBP) is the balance between gross primary productivity and losses attributed to autotrophic and heterotrophic respiration and disturbance/harvesting losses. The final question we must ask is how do all the potential gains and losses to the global terrestrial carbon cycle add up? A new study has brought new light to this sink by examining the net land greenhouse gas fluxes (associated with land plants, animals, and microbes) using a range of bottom-up and top-down modeling approaches that considered land use change, rising CO\(_2\), N deposition, and climate variability in tandem\(^9\). They reported that the global net carbon sink increased fourfold between the 1980s (when it ranged between -1.2 and -1.4 Pg-C y\(^{-1}\)) and the 2000s (when it ranged between -5.3 and -5.8 Pg-C y\(^{-1}\)).

Concluding remarks

The variability of the global carbon cycle is changing, as the amplitude of seasonal CO\(_2\) concentration and the net land sink are increasing. The causes of these trends in the global carbon cycle remain uncertain and a challenge for future research.

In this review, we show that different analyses have different explanations for why the seasonal CO\(_2\) amplitude and land sink are increasing. We advise investigators of future studies to test whether or not reported trends are significantly different from random errors associated with the uncertainties in modeling and measuring gross and net carbon fluxes.

Photosynthesis is the starting point of the carbon cycle. Yet, despite decades of research, our ability to produce an estimate of global photosynthesis with narrow confidence intervals and high accuracy remains elusive. Only with more accurate estimates of photosynthesis will we be able to better resolve and understand differences between data-driven and process models and to better simulate responses between net and gross carbon fluxes to temperature, precipitation, CO\(_2\) and nitrogen.

The response of global photosynthesis to CO\(_2\) fertilization remains unresolved, as the variations in the assimilation fluxes are small relative to the uncertainties of the drivers and information systems, using bottom-up and top-down methods. Indirect effects can be important too. For example, lengthening growing seasons can increase gross primary productivity on regional scales\(^1\). Vegetative regrowth may be offsetting losses of carbon by preceding fires. Thawing of the permafrost may expose and release vast stores of carbon that have been decoupled for millennia, while warming northlands are getting greener. Many experiments show acclimation effects of respiration to temperature\(^1\). This is a process that is not well considered by models, though some are starting to consider this factor\(^1\).

In closing, we need to continue the collection of long-term and multi-faceted products that are used to assess the global carbon cycle. Additional data from new satellites and longer time series from eddy covariance and CO\(_2\) concentration networks will reduce uncertainty in sampling and modeling and improve our ability to answer the questions associated with carbon cycle variability and trends.

Competing interests

The authors declare that they have no competing interests.

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