

This Provisional PDF corresponds to the article as it appeared upon acceptance. Fully formatted PDF and full text (HTML) versions will be made available soon.

Estimates of CO2 from fires in the United States: implications for carbon management

Carbon Balance and Management 2007, **2**:10 doi:10.1186/1750-0680-2-10

Christine Wiedinmyer (christin@ucar.edu) Jason C Neff (Jason.Neff@colorado.edu)

ISSN	1750-0680
Article type	Research
Submission date	13 August 2007
Acceptance date	1 November 2007
Publication date	1 November 2007
Article URL	http://www.cbmjournal.com/content/2/1/10

This peer-reviewed article was published immediately upon acceptance. It can be downloaded, printed and distributed freely for any purposes (see copyright notice below).

Articles in Carbon Balance and Management are listed in PubMed and archived at PubMed Central.

For information about publishing your research in *Carbon Balance and Management* or any BioMed Central journal, go to

http://www.cbmjournal.com/info/instructions/

For information about other BioMed Central publications go to

http://www.biomedcentral.com/

© 2007 Wiedinmyer and Neff, licensee BioMed Central Ltd.

This is an open access article distributed under the terms of the Creative Commons Attribution License (<u>http://creativecommons.org/licenses/by/2.0</u>), which permits unrestricted use, distribution, and reproduction in any medium, provided the original work is properly cited.

Estimates of CO₂ from fires in the United States: implications for carbon management

Christine Wiedinmyer^{1§} and Jason C. Neff²

¹ Atmospheric Chemistry Division/The Institute for Integrative and Multidisciplinary Earth Studies, National Center for Atmospheric Research, Boulder, CO, USA

² Geological Sciences Department and Environmental Studies Program, University of Colorado, Boulder, CO, USA

[§]Corresponding author

Email addresses:

CW: <u>christin@ucar.edu</u> JCN: <u>Jason.C.Neff@colorado.edu</u>

Abstract

Background

Fires emit significant amounts of CO_2 to the atmosphere. These emissions, however, are highly variable in both space and time. Additionally, CO_2 emissions estimates from fires are very uncertain. The combination of high spatial and temporal variability and substantial uncertainty associated with fire CO_2 emissions can be problematic to efforts to develop remote sensing, monitoring, and inverse modeling techniques to quantify carbon fluxes at the continental scale. Policy and carbon management decisions based on atmospheric sampling/modeling techniques must account for the impact of fire CO_2 emissions; a task that may prove very difficult for the foreseeable future. This paper addresses the variability of CO_2 emissions of CO_2 and Net Primary Productivity, and the potential implications for monitoring programs and policy development.

Results

Average annual CO₂ emissions from fires in the lower 48 (LOWER48) states from 2002-2006 are estimated to be 213 (\pm 50 std. dev.) Tg CO₂ yr⁻¹ and 80 (\pm 89 std. dev.) Tg CO₂ yr⁻¹ in Alaska. These estimates have significant interannual and spatial variability. Needleleaf forests in the Southeastern US and the Western US are the dominant source regions for US fire CO₂ emissions. Very high emission years typically coincide with droughts, and climatic variability is a major driver of the high interannual and spatial variation in fire emissions. The amount of CO₂ emitted from fires in the US is equivalent to 4-6% of anthropogenic emissions at the continental

scale and, at the state-level, fire emissions of CO_2 can, in some cases, exceed annual emissions of CO_2 from fossil fuel usage.

Conclusions

The CO₂ released from fires, overall, is a small fraction of the estimated average annual Net Primary Productivity and, unlike fossil fuel CO₂ emissions, the pulsed emissions of CO₂ during fires are partially counterbalanced by uptake of CO₂ by regrowing vegetation in the decades following fire. Changes in fire severity and frequency can, however, lead to net changes in atmospheric CO₂ and the short-term impacts of fire emissions on monitoring, modeling, and carbon management policy are substantial.

Background

Fires cover 3-4 million km² of the globe each year and are responsible for the release of 2-3 Pg of carbon to the atmosphere [1] [2]. In the Western US, the wildfires that sweep through forests during the summer months are often large, severe, and difficult to contain. A changing climate and a century of policies that encourage fire suppression, has increased the recent extent and frequency of Western US fires [3]. There are numerous well-documented effects of fire on atmospheric chemistry, pollutants, and ecosystems (e.g., [4], [5], [6]). Fire emissions impact climate through the direct emission of greenhouse gases, such as CO₂ and methane [7] and via secondary processes, for example, by altering aerosol and ozone concentrations [8]. The impacts of fire on CO₂ emissions to the atmosphere can be large at both the regional [9] and global [2] scales, but there is significant uncertainty regarding the magnitude, timing, and variability in CO₂ emissions from fires. Additionally, fires result in both biological and physical changes to the land surface that affects carbon exchange in subsequent years [6] and alter surface radiative balance for several decades [10].

At both national and international levels, there is an increasing focus on the establishment of emission inventories and regulation of regional C emissions to the atmosphere. In the United States, which has to date avoided federal binding commitments to CO₂ regulation, there is increasing activity at state and regional levels to control C fluxes to the atmosphere. One component of the emerging focus on C management is the development of international, national, and regional carbon inventory and monitoring programs. To the degree that monitoring or inventory programs focus solely on industrial activities, fires would have little impact on these activities. However, atmosphere-based regional emission monitoring and modeling tools (e.g., [11]) are being developed to deconvolve natural and human sources and sinks of carbon.

From the standpoint of atmospherically-based C monitoring programs, fire is problematic because fires tend to be extremely variable in both space and time, and because emission estimates from fires tend to be highly variable and uncertain (e.g., [2], [12], [13], [14]). The atmosphere integrates CO₂ emissions from many sources and so the variability and uncertainty in fire CO₂ emissions has the potential to propagate significant uncertainty through regional C monitoring programs. An effective C management policy will require a monitoring framework that is accurate and spatially resolved. Fires complicate the implementation of these tools because the

- 4 -

 CO_2 emitted from fires may reduce the accuracy of terrestrial sources and sink estimates from monitoring efforts.

There has been an active and ongoing discussion about the role of biosphere C exchange in CO₂ mitigation and the Kyoto Protocol includes a limited set of biosphere-based forestry and agricultural-management options that can be used to partially offset fossil fuel emissions [15]. From a policy standpoint, the role of fire in C policy development depends on the scope of any mandated emission reductions and whether biogenic sources are incorporated into emission inventories; to date this has not been the case for 'natural' emission sources such as fire, but the role of these fluxes in future policy remains uncertain. Outside the scope of treaties or national emission policy development, terrestrial C fluxes are also playing a role in the largely unregulated C offset/sequestration industry through the use of terrestrial C sequestration techniques. The large biosphere/atmosphere C fluxes have led to extensive study of both the capacity of terrestrial ecosystems to sequester C and the potential duration of terrestrial sinks [16], [17]. However, there is also growing concern regarding the tendency for the leakage of stored C from terrestrial sinks [15], as this leakage has the potential to reduce the efficiency of industrial emission reductions.

Fire is one of the largest potential risks to loss of stored terrestrial C and is a loss pathway that is difficult to quantify due to the high degree of spatial and temporal variation in fire emissions. At multi-decadal time scales, wildfires have a near neutral effect on atmospheric CO_2 : forest regrowth balances punctuated C losses due to combustion, assuming that fire return intervals remain constant [18]. However, on the

- 5 -

shorter time scales of legislative agreements, international accords, or in the context of the emerging markets for carbon offsets, fires can lead to rapid, large emissions of C and add considerable uncertainty to projections of decadal scale ecosystem carbon budgets [6], [19].

In the Western US, fires can be widespread in a state one year and virtually absent the next (e.g., [13]). In a study of emissions in Canada, wildfires contribute the equivalent of 18% of emissions from the energy sector of the country with a year to year range in emissions that varies from 2 to 75% [9]. Although fires may not become a target for national emission regulations, the fluxes from these events, if they are as significant as Amiro et al. [9] report, are clearly important short-term influences on regional C emission patterns. The combination of uncertainty in emission estimates due to the spatial heterogeneity in burns, and uncertainty regarding the degree of combustion of aboveground biomass and soil organic matter stocks [20] makes attribution of C fluxes associated with fire very challenging. In the context of C monitoring, the potential of fires to match, or even exceed, industrial fluxes in some settings and the high degree of uncertainty associated with these fluxes could make it difficult to develop regional C monitoring techniques that would be capable of providing sufficient source/sink information for policy development or implementation.

Fire return intervals in forested US ecosystems vary, but range from decades in semiarid interior forests to centuries for coastal ecosystems [21]. There has been much debate over the role of historical land management practices, such as fire suppression, in contemporary fire and forest growth patterns and a growing discussion of how wildfires will respond to climate change (e.g., [3], [22], [23]). The long duration of forest regrowth between fire events and the variability in the magnitude of C emission during fire highlights the uncertainty of this aspect of terrestrial C cycling. In the Kyoto protocol, the complex nature of terrestrial sources and sinks led to a relatively narrow definition of the types of terrestrial C sequestration activities that could be used to meet treaty objectives [24]. These sequestration activities thus far have been largely constrained to agricultural management and reforestation projects, although there has been a vigorous and ongoing debate about the appropriate scope of terrestrial C sequestration activities [25]. At regional and national levels, terrestrial sinks driven by historic land use change, such as reforestation efforts, can be sizeable [26] and may represent an attractive target in future C mitigation negotiations. Similarly, fire mitigation programs such as forest thinning may reduce the severity or extent of fires, but may also have uncertain impacts on sequestered carbon (depending on the fate of C removed from forests). From this standpoint, the potential for C losses from fire represents a risk to C sequestration potential and a factor that needs to be considered in discussions regarding appropriate credit for terrestrial sinks in atmospheric C mitigation.

In this study, we evaluate the role that fire plays in carbon emissions from a number of states throughout the US. The motivation, following Amiro et al., [9], is, in part, to assess the degree to which fire can influence regional carbon budgets and the year to year and state to state variability of the potential impacts. This is the first study of which we are aware that includes the spatial and temporal resolution of fire CO_2 emissions for the US, and assesses the importance of these emissions compared to fossil fuel burning CO_2 emissions. We also focus on the role that fire may play in

- 7 -

longer-term ecosystem C budgets by comparing fire emissions to Net Primary Productivity (NPP) in a range of ecosystems at a regional level. Through these comparisons, our goal is to more clearly delineate the role that fire is playing in regional C budgets with the hope of providing some insight into the impact that fire may have on both C monitoring and management plans in the future.

Results and discussion

CO₂ emissions from fires

Daily CO₂ emissions from fires in North America were estimated for 2002 through 2006 using the methods described by Wiedinmyer et. al. [13]. Annually, the average CO₂ emitted from fires in the lower 48 (LOWER48) states from 2002-2006 is estimated to be 213 (\pm 50 std. dev.) Tg CO₂ yr⁻¹ and 80 (\pm 89 std. dev.) Tg CO₂ yr⁻¹ in Alaska. There is substantial variation in the overall magnitude of annual emissions from states in the US, ranging from the average of 80 Tg of CO_2 in Alaska to < 0.01 Tg CO₂ in Rhode Island and Vermont. Emissions from the Northeastern and Midwestern US states tend to be very small; the annual emissions from the US are dominated by the Western and Southeastern US states. For many Western and Southeastern US States, there are large annual fire emissions of CO₂ averaging ~10 Tg CO₂ (with an average coefficient of variance of more than 50%). The Northeastern states have the least amount of emissions per area: Vermont, Rhode Island, Maine, and New Hampshire all have an average annual fire emission of <1 metric ton CO₂ km⁻². The Southeastern and Western states have the largest amount of CO₂ from fires: Alabama, Florida, Georgia, Louisiana, and Washington all have an average annual fire emission > 75 metric ton $CO_2 \text{ km}^{-2}$.

The interannual variability in the annual emission estimates is substantial. In the LOWER48, the annual emissions from year to year vary as much as a factor of 1.8, and in Alaska, the annual CO_2 estimates vary by over an order of magnitude. Overall, the interannual variance of fire emissions in the Southeastern US is lower than in the Western US. This interannual variability could arise from several causes, including changes in meteorology and climate (e.g., drought) and land management practices that deal with agricultural and prescribed burning.

Fires occur within the US for a number of reasons, including wildfires started from both natural and anthropogenic causes, prescribed burning, and burning for agricultural purposes. An analysis of the fire emission estimates presented here shows that the majority of the emissions from fires in the US are from needleleaf forests. For 2006, needleleaf forests are estimated to emit 78% of the CO₂ emissions from continental US fires. This suggests that, although important, natural and prescribed burning in grasslands and burning in croplands for agricultural purposes does not contribute significantly to the overall annual US CO₂ fire emissions inventory. CO₂ emissions from grasslands account for 5% of the 2006 estimated fire emissions inventory, and emissions from croplands contribute <3%. In both the Western and the Southeastern US, 86% of the estimated 2006 CO₂ emissions come from needleleaf forests.

The amount of area burned for management practices (prescribed burns) varies by region. In the Southeastern US, the majority of acreage burned is via prescribed burns. According to the National Interagency Fire Center (NIFC; [27]) less than one third of the reported area burned in 2006 in the Southeastern states was due to

- 9 -

wildfires; two thirds of the area burned was the result of prescribed burns. In Alabama, 94% of the 2006 reported burn area was attributed to prescribed burns. Since prescribed burns in the Southeastern US tend to occur between November and April [28] and the majority of emissions in this region come from needleleaf forests, we assume that much of the emissions through the spring and fall months (discussed below) can be primarily attributed to prescribed burns in forested areas.

In the Western US, fire-related CO_2 emissions are dominantly related to wildfire activity. A report for the Western Regional Air Partnership [29] estimates that 57% of the acreage burned in 2002 in the Western US States was due to wildfires, 23% for agricultural purposes, and the remainder for land management practices. Although the percentage of agricultural burned area was significant, the amount of biomass burned, and therefore the emissions, were relatively small in the overall inventory.

Seasonal variation in fire CO₂ emissions

There is strong seasonal variation in fire CO_2 emissions, with regional differences in the peak emissions across the US. Generally, the monthly emissions of CO_2 from fires in the LOWER48 have two peaks: a small peak during the spring months (March and April) and a larger peak during the summer months (Figure 1). These two peaks are driven by the timing of fires in two distinct portions of the US, with spring fire emissions dominated by fires in the Southeastern and Central US, and summer fire emissions driven by emissions for the Western US (Figure 2).

Large, periodic fires can cause massive fluxes of CO_2 to the atmosphere. Figure 3 shows monthly CO_2 release from fires from six states including Alaska, four western

US states, and Mississippi. These results illustrate the extreme variability in emissions associated with large fire events, such as the Columbia Complex fire in Washington in August 2006, or the Biscuit fire in Oregon in July of 2002, during which more than 15 Tg of CO_2 was released from each of these states.

In 2002, the Biscuit fire burned in Oregon from mid-July to September. The emissions from this fire were exceptionally large and drove the peaks in CO₂ emissions for July and August 2002 for Oregon (Figure 3). Estimates using the methods described here (see Methods Section below) predict 4.9 Tg C (from CO₂) and 5.3 Tg C (from CO₂ and CO) from the Biscuit fire (in Oregon only). Law et al. [30] used a simple method, based on the reported burn area and an assumed carbon loading, to estimate 4.1 Tg C from the same fire. The sizeable difference in emission estimates emphasizes the large uncertainty associated with estimating C emissions from fires. Estimates of fire emissions of CO₂ depend on a wide range of factors, including the severity and type of burns, as well as the spatial heterogeneity of vegetation and fire intensity [2], [6]. Combined, these factors make it exceptionally difficult to accurately measure C emissions from field-based techniques, regardless of methods used. Unfortunately, remote sensing-based methods also result in highly uncertain C flux estimates for fire, and there is currently no clear method available to reduce these uncertainties [19]. Given these complexities, the flux estimates for the Biscuit fire made by this study and the Law et. al. [30] study are probably about as similar as can be expected. Law et. al. [30] applied a reported burn area, while the method employed in this study applied a burn area based on remote sensing observations. Both methods used different fuel loading estimates and emission factors. The impact of inherent uncertainty in emission estimates is that the high

degree of variability (e.g., >25% of the flux) in fire emission estimates is not likely to be reduced soon and has implications for both our understanding of fires in the global carbon cycle and our ability to monitor and assess the causes of biosphere-atmosphere fluxes at a regional scale.

Fires and regional CO₂ emissions

A striking implication of very large wildfires is that a severe fire season lasting only one or two months can release as much carbon as the annual emissions from the entire transportation or energy sector of an individual state. While the long-term atmospheric implications of wildfire and fossil-fuel C release can be strikingly different, the pulsed emission releases from wildfire events can match or even exceed monthly or annual industrial emissions on a regional basis. To examine the role of wildfire in the context of industrial emissions, we compare national and state level emissions of CO_2 from fossil fuel combustion to our estimated fire emissions of CO_2 .

Annually, for the continental US (not including Washington D.C.), the average CO_2 emissions from all fossil fuel burning (FFB) sources from 2000 – 2003 were 5738 Tg CO_2 [31]. Annual average CO_2 emissions for 2002 – 2006 from fires in the continental US was 293 Tg CO2, corresponding to the equivalent of 5.1% of the annual FFB emissions from 2000-2003 (and 5.4% of the average from 1990-2003). Depending on the year, emissions from fires for the entire Continental US were equivalent to as little as 4% of the FFB emissions, and as much as 6%. However, this is for the entire U.S; on a state-level, the importance of fire emissions of CO_2 relative to FFB emissions is much different. There are eight states (Alaska, Idaho, Oregon, Montana, Washington, Arkansas, Mississippi, and Arizona) where the annually-averaged (2002-2006) fire emissions are equal to more than 10% of the state-level

FFB CO₂ emissions, and eleven other states whose fire emissions equal more than 5% of the state-level CO₂ emissions (Figure 4, Additional Table 1). In the case of Alaska, annually-averaged fire emissions of CO₂ (2002-2006) are consistently greater than the annually averaged (2000-2003) emissions from FFB (Figure 4). For the states located in the Western and Southeastern US, average annual fire emissions of CO₂ range from the equivalent of 2-4% of FFB emissions in North Carolina, Colorado, and Wyoming, to 89% of emissions in Idaho. (It should be noted, however, that Idaho does not have any coal-fire power plants, which emit large amounts of CO₂). For the Western US States, fire CO₂ emissions on average are equivalent to $11 \pm 4\%$ of annual FFB CO₂ emissions, and for the Southeastern US fire CO₂ emissions are equivalent to $6 \pm 2\%$ of annual FFB CO₂ emissions.

The relative importance of CO₂ emissions from fires to regional C emissions varies seasonally and annually. For example, during particularly intense fire years, such as 2006 in Idaho, the emissions of CO₂ from fires in Idaho were 1.6 times higher than all of the annually-averaged (2000-2003) FFB emissions from that state, and nearly double the mean annual fire CO₂ emissions for the state for 2002-2006. Similarly, in 2006, Montana and Washington experienced CO₂ emissions from fires during the year that were equivalent to ~ 47 and 42% of the total annual state-level FFB CO₂ emissions, respectively. In addition to significant interannual variation, regional fires are typically active for just a few months of the year. The monthly emissions of CO₂ from fires for 2002 through 2006 for six selected states are shown in Figure 3. Alaska, Montana, Washington, and Oregon all show large summer peaks in wildfire CO₂ emissions that are of the same magnitude or greater than the CO₂ from FFB sources during those months.

In California, the annual FFB emissions inventory of CO₂ is the largest in the country behind Texas (362 Tg CO_2 yr⁻¹ averaged from 1990-2003). Even so, the annual averaged emissions of CO₂ from fires are significant (24 Tg CO2 yr⁻¹; equivalent to 6% of the FFB emission estimates). Although the ratio of annual state-level CO₂ emissions from fires to FFB sources is fairly low, and California does not have significant coal-fire power plant CO₂ emissions, this ratio is also subject to substantial variation. By the end of October 2003, wildfires burned more than 750,000 acres, producing the equivalent of 49% of the monthly CO₂ emitted by FFB sources for state. This occurred in more than one year that we investigated. The major wildfires in September 2006, including the Day Fire in Southern California, produced an estimated 16 Tg CO₂ for that month, equivalent to approximately 50% of estimated total monthly FFB emissions for the entire state. Thus, even in highly industrialized regions of the country with significant FFB CO₂ emissions, fires can contribute significant amounts of CO₂ to the atmosphere. These fires not only impact regional CO₂ fluxes, but can also impact visibility and air quality. Phuleria et. al. [5] shows how the emissions from the October 2003 Californian fires increased air pollutant concentrations, most notably particulate matter with diameters less than 10 µm (PM10), throughout the Los Angeles Basin.

Multi-decadal implications of fire C release

Fires represent a potentially large short-term release of carbon that is largely offset over longer time scales (decades) by the uptake of atmospheric carbon associated with forest regrowth. From this standpoint, fires and fossil fuel emissions have entirely different effects on atmospheric CO_2 levels with the expectation that in the absence of changes in frequency or intensity, fire emissions would be balanced over a period of several decades by forest regrowth and C assimilation. To evaluate the magnitude of C released from fire in the context of annual plant C sequestration, we compared emission estimates from fire to annual estimates of Net Primary Productivity (NPP; gC m⁻² year⁻¹) derived from MODIS satellite observations ([31], [32], [33], [34], [35]) for 2000 through 2005. Annually-averaged NPP (2000-2005) by state is estimated from these base datasets (Additional File Table 1). For the LOWER48, the annually-averaged NPP was estimated as 9369 Tg CO₂ yr⁻¹. On an annual basis, fires result in a release of the equivalent of 4% of the annual NPP flux in both the Western and the Southeastern US. However, this is highly variable. For example, average annual fire emissions of CO₂ range from 0.7-1.4% of estimated NPP in North Carolina, Colorado, and Wyoming, to more than 6% for Arizona, Idaho, and Louisiana. For the Western US, fires on average represent $3.8 \pm 1.5\%$ of annual average NPP, similar to the results for the Southeastern US, where CO₂ from fires is $3.6 \pm 1.1\%$ of annual average NPP.

The large conversion of terrestrial biomass to CO₂ during a fire is largely balanced over longer time scales by the uptake of C in regrowing forest. In North American Boreal ecosystems, there commonly is a period of several years to a decade during which C is lost from ecosystems, followed by several decades to a century of C uptake in regrowing forests [6], [36]. However, fire regimes and intensity are changing for at least some portions of the US [3], [21], and following European settlement of the Western US, the fire frequency in some forests was reduced [37] leading to an accumulation of C in terrestrial systems. The relatively large fraction of NPP that is currently lost to fire in a number of Western US ecosystems represents, in part, the return of some of this historically accumulated C to the atmosphere, and sets the stage for future C uptake in these forested ecosystems. The historic and future impact of fire emissions on atmospheric CO_2 also depends on the frequency and intensity of fires in the 21st century. A shortening of fire return intervals, increases in area burned, and/or increases in fire severity can lead to net emissions of CO_2 , even on a multi-decadal times scale [6], [10], [38]. With changing climate and projected increases in burned area in the US [39], [40], there is a significant potential for additional net release of C from the forests of the United States due to changing fire dynamics in the coming decades.

Conclusions

Fires represent a large and highly variable component of the US carbon budget. This study illustrates the high degree of spatial variability in fire CO_2 emissions with exceptionally large fluxes of CO_2 due to wildfire in the Western US and large emissions from controlled burns and forest management activities in the Southeastern US. In some Western US states, such as Alaska and Idaho, the annual emission of CO_2 from wildfire in some years equals or exceeds the emissions from fossil fuel combustion. Even in states with large FFB CO_2 sources, such as California, fires can be a significant annual and highly significant seasonal component to the regional C budget.

The long-term impacts of CO_2 emissions from fire are considerably different than from fossil fuel burning emissions because fire emissions are at least partially balanced over decades by forest regrowth and terrestrial C sequestration. Changing climate and fire regimes, however may lead to fire emissions that increasingly diverge from historical means. Over shorter time periods fires, with their inherently uncertain emission estimates, represent a major hurdle to the establishment of accurate C source and sink accounting based on atmospheric CO_2 observations. While isotopic and tracer techniques could certainly aid in the reduction of uncertainty in regional C inverse modeling, fires represent a level of complexity in terrestrial C dynamics that deserve increased attention.

Methods

Fire emission estimates

A simple modeling approach, described by Wiedinmyer et. al. [13], was used to calculate the daily fire emissions of carbon dioxide (E_{CO2}) in North America from 2002 through 2006. E_{CO2} was calculated as:

$$E_{CO2} = A(x,t) * B(x,t) * EF_{CO2}$$
 (1)

where A(x,t) is the area burned at location x and time t, B(x,t) is the biomass burned at location x and time t, and EF_{CO2} is an emission factor, or the mass of CO_2 that is emitted per mass of biomass burned.

With this method, fire location and timing is determined with the MODIS Active Fire product. The MODIS instruments aboard the NASA Terra and Aqua satellites each provide approximately twice-daily passes over North America. These daily fire detections were processed by the US Forest Service Remote Sensing Applications Center for 2002 through 2006 using the MODIS Active Fire data developed by the UMD Rapid Response team [41].

The fuel loading at each fire was determined using a combination of satellite products. The Global Land Cover 2000 (GLC2000) dataset is used to characterize the ecosystem type for each identified fire. The GLC2000 identifies 29 different land cover classes in North and Central America at a 1 km² resolution [42]. For each land cover class, a total fuel loading has been assigned using a combination of values found in the literature [13]. The fraction of woody and herbaceous fuels associated with each class was determined using information from the Fuels Characterization Classification System (FCCS; [43], [44]). The fraction of forest, herbaceous cover, and bare ground at each fire was determined using the Vegetation Continuous Fields (VCF) MODIS product, scaled to 1 km² [45], [46]. The amount of biomass burned was assumed to be a function of forest cover (where > 60% tree cover is considered forest, 40-60% tree cover is considered Woodlands, and <40% tree cover is considered Grasslands), following the methods applied by Ito and Penner [47].

For the results shown here, each detected fire was treated as an individual fire. Based on the nominal resolution of the MODIS instruments, the total possible area burned for each fire pixel was assumed to be 1 km^2 . For each fire detection, the 1 km^2 was scaled to the amount of bare cover assigned at that spot by the VCF product. For example, if the bare cover was 20% at a fire point, the area burned was estimated to be 0.8 km^2 . Using this methodology, daily fire emissions of CO₂ were estimated for 2002 through 2006. Only emissions from the US are presented in this paper.

Fire emission estimate uncertainty

The emissions of CO_2 from fires are highly uncertain due to the combined errors and uncertainties in the model framework and inputs. Uncertainties in the fire emission

estimates may arise from the satellite detections of the fires, the assumptions made in the fuel loading and amount of fuel burned, the estimated area burned, and the assigned emission factors. The Active Fire satellite product produces daily fire detections. This product is not screened for missing data, and does not flag those areas obstructed by clouds. The timing of the satellite detections and the inability to detect fire through clouds can lead to missed detections and an underestimation of fire detections [41], [48]. The area burned assigned to each pixel (1 km²) is considered an upper estimate. The fuel loadings associated with each general land cover classification are taken from few studies, and in reality are highly variable.

Wiedinmyer et. al. [13] were unable to assign a quantitative assessment of uncertainty on the emission estimates using the described modeling technique. However, they predict that the uncertainties can be over a factor of two. When compared to other estimates of CO₂ emissions from fires, these estimates are within this uncertainty. For the Conterminous US, the Global Fire Emissions Database, version 2 (GFEDv2, [2]) predict emissions of CO₂ that are approximately two to five times lower than those estimates here. Other models used to predict emissions from fires are much closer to the values predicted here. A more comprehensive intercomparison of emission estimates of CO from fire emissions models for the US is described by Al-Saadi et. al. [12]. In general, the emissions from the methodology used here are higher than those predicted by the GFEDv2, but lower than those predicted by a NOAA product [12]. To consider the uncertainty associated with the emission estimates, we assign a factor of at least 2 to the estimates. The validation of fire emission estimates is difficult, since the emissions from fire to fire are highly variable, and direct flux measurements from fires are extremely difficult. Inverse modeling of fire emissions using *in situ* measurements or satellite observations provides a means to constrain fire emission estimates: however, these methods can not provide a direct quantification of emissions from fires. The uncertainty in the fire emission estimates, along with the variability in the spatial and temporal allocation of these emissions, adds further complications for efforts to constrain C fluxes with monitoring and modeling techniques. Future work is needed not only to better quantify emissions from fires, but to better constrain the uncertainties associated with the estimates.

Net Primary Productivity

The Net Primary Productivity (NPP) is defined as the rate at which biomass grows in an ecosystem. It is often used as a measure of carbon uptake by vegetation, or carbon stored in vegetation. For this study, the annual NPP values determined from the MODIS Satellite instruments were used [31], [32], [33], [34], [35]. This product provided annual NPP values (gC m⁻² year⁻¹) with a spatial resolution of 1 km² for the continuous US Annual NPP values (TgCO₂ yr⁻¹) for each of the 6 years (2000-2005) were averaged for each state in the continuous US.

Fossil fuel burning emissions of CO₂

To evaluate the importance of biomass burning emissions relative to those from fossil fuel burning, the US Department of Energy report of annual CO_2 emissions from fossil fuel combustion for the country [31] is used. The annual total CO_2 emissions by state from 1990 to 2003, was published in April 2007 [50]. This inventory does

not include all industrial sources, but is the most complete inventory of which we are aware.

Competing interests

The author(s) declare that they have no competing interests.

Authors' contributions

CW performed the fire emission estimates and processed the DOE FFB emissions and the NPP data. CW and JN both analyzed the results and contributed equally to the manuscript. Both authors have read and approved the final manuscript.

Acknowledgements

The authors would like to thank Jana Milford, Peter Thornton, and five anonymous reviewers for their useful comments on the manuscript. The authors also thank Maosheng Zhao for assistance with the NPP data, Brad Quayle for providing the MODIS fire counts, and David Schimel for helpful discussions. The National Center for Atmospheric Research is sponsored in part by the National Science Foundation.

References

[1] Giglio, L., van der Werf, G. R., Randerson, J. T., Collatz, G. J., and Kasibhatla, P. **Global estimation of burned area using MODIS active fire observations.** *Atmospheric Chemistry and Physics* 2006, 6: 957-974.

[2] van der Werf, G. R., Randerson, J. T., Giglio, L., Collatz, G. J., Kasibhatla, P. S., and Arellano, A. F. **Interannual variability in global biomass burning emissions from 1997 to 2004.** *Atmospheric Chemistry and Physics* 2006, 6: 3423-3441.

[3] Westerling, A. L., Hidalgo, H. G., Cayan, D. R., and Swetnam, T. W. **Warming** and earlier spring increase western US forest wildfire activity. *Science* 2006, 313:

940-943.

[4] Wotawa, G. and M. Trainer. The influence of Canadian forest fires on pollutant concentrations in the United States. *Science* 2000, 288(5464): 324-328.

[5] Phuleria, H. C., P. M. Fine, Y. Zhu, and C. Sioutas: Air quality impacts of the October 2003 Southern California wildfires. *J. Geophys. Res.* 2005, 110: D07S20, doi:10.1029/2004JD004626.

[6] Harden, J. W., Trumbore, S. E., Stocks, B. J., Hirsch, A., Gower, S. T., O'Neill, K. P., and Kasischke, E. S. **The role of fire in the boreal carbon budget.** *Global Change Biology* 2000, 6: 174-184.

[7] Simpson, I. J., F. S. Rowland, S. Meinardi, and D. R. Blake. **Influence of biomass burning during recent fluctuations in the slow growth of global tropospheric methane.** *Geophys. Res. Lett.* 2006, 33, L22808, doi:10.1029/2006GL027330.

[8] Naik, V., D. L. Mauzerall, L. W. Horowitz, M. D. Schwarzkopf, V. Ramaswamy, and M. Oppenheimer. **On the sensitivity of radiative forcing from biomass burning aerosols and ozone to emission location**, *Geophys. Res. Lett.* 2007, 34, L03818, doi:10.1029/2006GL028149.

[9] Amiro, B. D., Todd, J. B., Wotton, B. M., Logan, K. A., Flannigan, M. D., Stocks, B. J., Mason, J. A., Martell, D. L., and Hirsch, K. G. **Direct carbon emissions from Canadian forest fires, 1959-1999.** *Canadian Journal of Forest Research-Revue Canadienne De Recherche Forestiere* 2001, 31: 512-525.

[10] Randerson, J. T., Liu, H., Flanner, M. G., Chambers, S. D., Jin, Y., Hess, P. G., Pfister, G., Mack, M. C., Treseder, K. K., Welp, L. R., Chapin, F. S., Harden, J. W., Goulden, M. L., Lyons, E., Neff, J. C., Schuur, E. A. G., and Zender, C. S. **The impact of boreal forest fire on climate warming.** *Science* 2006, 314: 1130-1132.

[11] Carbon Tracker, [http://www.esrl.noaa.gov/gmd/ccgg/carbontracker/].

[12] Al-Saadi, J. A. A. Soja, B. Pierce, C. Kittaka, L. Emmons, S. Kondragunta, X. Zhang, C. Wiedinmyer, T. Schaack, and J. Szykman: Global Near-Real-Time Estimates of Biomass Burning Emissions using Satellite Active Fire Detections, presented at 16th International Emission Inventory Conference, Raleigh, NC, May 14 – 17, 2007 [available online at http://www.epa.gov/ttn/chief/conference/ei16/].

[13] Wiedinmyer, C., B. Quayle, C. Geron, A. Belote, D. McKenzie, X. Zhang, S. O'Neill, and K.K. Wynne. Estimating emissions from fires in North America for Air Quality Modeling. *Atmospheric Environment* 2006, 40: 3419-3432.

[14] Jain, A.K. Global estimation of CO emissions using three sets of satellite data for burned area. *Atmospheric Environment* 2007, 41: 6931-6940.

[15] Kennett, S. A. National policies for biosphere greenhouse gas management: Issues and opportunities. *Environmental Management* 2002, 30: 595-608.

[16] Cannell, M. G. R. Carbon sequestration and biomass energy offset: theoretical, potential and achievable capacities globally, in Europe and the UK. *Biomass & Bioenergy* 2003, 24: 97-116.

[17] Yamasaki, A. An overview of CO₂ mitigation options for global warming - Emphasizing CO2 sequestration options. *Journal of Chemical Engineering of Japan* 2003, 36: 361-375.

[18] Kurz, W. A., and Apps, M. J. Contribution of Northern Forests to the Global C Cycle - Canada as a Case-Study. *Water Air and Soil Pollution* 1993, 70: 163-176.

[19] French, N. H. F., Goovaerts, P., and Kasischke, E. S. Uncertainty in estimating carbon emissions from boreal forest fires. *Journal of Geophysical Research-Atmospheres* 2004, **109**(D14): Art. No. D14S08.

[20] Neff, J. C., Harden, J. W., and Gleixner, G. **Fire effects on soil organic matter content, composition, and nutrients in boreal interior Alaska.** *Canadian Journal of Forest Research-Revue Canadienne De Recherche Forestiere* 2005, 35: 2178-2187.

[21] Noss, R. F., Franklin, J. F., Baker, W. L., Schoennagel, T., and Moyle, P. B. **Managing fire-prone forests in the western United States.** *Frontiers in Ecology and the Environment* 2006, 4: 481-487.

[22] Bodin P, Wiman BLB: **The usefulness of stability concepts in forest management when coping with increasing climate uncertainties**. *Forest Ecology and Management* 2000, 242(2-3): 541-52.

[23] Girod, C.M., G.C. Hurtt, S. Frolking, J.D. Aber, A.W. King. **The tension between fire risk and carbon storage: evaluating US carbon and fire management strategies through ecosystem models**. *Earth Interactions* 2007, 11:33.

[24] Subak, S. Agricultural soil carbon accumulation in North America: considerations for climate policy. *Global Environmental Change-Human and Policy Dimensions* 2000, 10: 185-195.

[25] Martin, P. H., Nabuurs, G. J., Aubinet, M., Karjalainen, T., Vine, E. L., Kinsman, J., and Heath, L. S. **Carbon sinks in temperate forests.** *Annual Review of Energy and the Environment* 2001, **26**: 435-465.

[26] Pacala, S. W., Hurtt, G. C., Baker, D., Peylin, P., Houghton, R. A., Birdsey, R. A., Heath, L., Sundquist, E. T., Stallard, R. F., Ciais, P., Moorcroft, P., Caspersen, J. P., Shevliakova, E., Moore, B., Kohlmaier, G., Holland, E., Gloor, M., Harmon, M. E., Fan, S. M., Sarmiento, J. L., Goodale, C. L., Schimel, D., and Field, C. B. Consistent land- and atmosphere-based US carbon sink estimates. *Science* 2001, 292: 2316-2320.

[27] National Interagency Fire Center, [http://www.nifc.gov/nicc/predictive/intelligence/intelligence.htm]. [28] Haines, T.K., R.L. Busby, D.A. Cleaves. **Prescribed burning in the South:** trends, purpose, and barriers. *Southern Journal of Applied Forestry* 2001 25:149–153.

[29] Western Regional Air Partnership (WRAP). **2002 Fire Emission Inventory for the WRAP Region – Phase II**, Project No. 178-6, July 22, 2005, [http://www.wrapair.org/forums/fejf/tasks/FEJFtask7PhaseII.html].

[30] Law, B.E., D. Turner, J. Campbell, O. J. Sun, S. Van Tuyl, W. D. Ritts and W. B. Cohen: **Disturbance and climate effects on carbon stocks and fluxes across Western Oregon USA**, *Global Change Biology* 2004, 10: 1429–1444.

[31] U.S. Department of Energy, [http://www.eia.doe.gov/environment.html].

[32] Running S.W., R.R. Nemani, F.A. Heinsch, M. Zhao, M. Reeves and H. Hashimoto: A continuous satellite-derived measure of global terrestrial primary productivity: Future science and applications. *Bioscience* 2004, 56(6): 547-560.

[33] Zhao, M., F. A. Heinsch, R. R. Nemani, and S. W. Running: **Improvements of the MODIS terrestrial gross and net primary production global dataset**, *Remote Sensing of Environment* 2005, 95: 164-176.

[34] Zhao, M., S. W. Running, and R. R. Nemani: Sensitivity of Moderate Resolution Imaging Spectroradiometer (MODIS) terrestrial primary production to the accuracy of meteorological reanalyses. Journal of Geophysical Research, 2006, 111, G01002, doi:10.1029/2004JG000004.

[35] Heinsch, F.A., M. Zhao, S.W. Running, et al: **Evaluation of remote sensing based terrestrial productivity from MODIS using regional tower eddy flux network observations.** *IEEE Transactions on Geoscience and Remote Sensing* 2006, 44(7): 1908-1925.

[36] Hicke, J. A., Asner, G. P., Kasischke, E. S., French, N. H. F., Randerson, J. T., Collatz, G. J., Stocks, B. J., Tucker, C. J., Los, S. O., and Field, C. B. **Postfire** response of North American boreal forest net primary productivity analyzed with satellite observations. *Global Change Biology* 2003, 9: 1145-1157.

[37] Savage, M., and Swetnam, T. W. Early 19th-Century Fire Decline Following Sheep Pasturing in a Navajo Ponderosa Pine Forest. *Ecology* 1990, 71: 2374-2378.

[38] Kashian, D.M., W.H. Romme, D.B. Tinker, et al. **Carbon storage on landscapes with stand-replacing fires.** *Bioscience* 2006, 56 (7): 598-606.

[39] Neilson, R.P. and R.J. Drapek. **Potentially complex biosphere responses to transient global warming.** *Global Change Biology* 1998, 4 (5): 505-521.

[40] Dale, V.H., L.A. Joyce, S. McNulty, et al. Climate change and forest disturbances. *Bioscience* 2001, 51 (9): 723-734.

[41] Giglio, L., J. Descloitres, C.O. Justice, Y.J. Kaufman. **An Enhanced Contextual Fire Detection Algorithm for MODIS.** *Remote Sensing of Environment* 2003, 87(2-3): 273-282.

[42] Latifovic, R., Z. Zhu, J. Cihlar, J. Beaubien, R. Fraser: **The Land Cover Map for North America in the Year 2000**. GLC2000 database, European Commission Joint Research Centre, 2003. [http://www.gvm.jrc.it/glc2000].

[43] Fuels Characterization Classification System (FCCS), [http://www.fs.fed.us/pnw/fera/fccs/].

[44] Ottmar, R.D.; Sandberg, D.V.; Prichard, S.J.; Riccardi, C.L: An Overview of the Fuel Characteristic Classification System – Quantifying, Classifying, and Creating Fuelbeds for Resource Planning. *Canadian Journal of Forest Research* 2007, In press.

[45] Hansen, M., R. DeFries, J.R. Townshend, M. Carroll, C. Dimiceli, and R. Sohlberg Vegetation Continuous Fields MOD44B, 2001 Percent Tree Cover, Collection 3, University of Maryland, College Park, Maryland, 2003.

[46] Hansen, M., R.S. DeFries, J.R.G. Townshend, M. Carroll, C. Dimiceli, and R.A. Sohlberg. **Global Percent Tree Cover at a Spatial Resolution of 500 Meters: First Results of the MODIS Vegetation Continuous Fields Algorithm**. *Earth Interactions* 2003, 7(10): 1-15.

[47] Ito, A., Penner, J. E. Global estimates of biomass burning emissions based on satellite imagery for the year 2000. *J. Geophys. Res.* 2004, 109, D14S05, doi:10.1029/2003JD004423.

[48] NASA/University of Maryland. MODIS Hotspot / Active Fire Detections. Data set. MODIS Rapid Response Project, NASA/GSFC [producer], University of Maryland, Fire Information for Resource Management System [distributors]. 2002, Available on-line [http://maps.geog.umd.edu]

[50] US Department of Energy, [http://www.eia.doe.gov/oiaf/1605/ggrpt/excel/tbl_statetotal.xls].

Figures

Figure 1 - Annual emissions of CO2 from fires

Monthly emissions of CO_2 from fires for the LOWER48, averaged for 2002-2006. The error bars represent the standard deviation of the monthly emissions for the 5 years.

Figure 2 – Monthly CO₂ emissions by region

Annually-averaged CO₂ emissions (2002-2006) from fires for five US regions. (Western US = AZ, CA, CO, ID, MT, NM, NV, OR, UT, WA, WY; Southeastern US = AL, FL, GA, LA, MS, NC, SC, TN; Mid-Atlantic & New England = CT, DE, MA, MD, ME, NH, NJ, NY, PA, RI, VA, VT, WV; Midwestern US = IL, IN, KY, MI, OH, WI; Central US = AR, IA, KS, MN, MO, NB, ND, OK, SD, TX)

Figure 3 - Monthly state CO₂ emissions

Monthly emissions of CO_2 from fires and from anthropogenic sources for selected states.

Figure 4 - Annual CO₂ emissions by state

Annually-averaged anthropogenic emissions (2000-2003) of CO_2 and annuallyaveraged CO_2 emissions (2002-2006) from fires for states where average fire emissions greater than 5% of the states' anthropogenic emissions. The error bars associated with the fire emission estimates represent the standard deviation of the monthly emissions for 2002-2006.

Tables

Table 1 - Annual CO₂ emissions from fires (Tg CO2 yr-1)

The annual estimated CO_2 emissions from fires(Tg yr⁻¹) for the LOWER48 and for Alaska.

Year	LOWER48	Alaska	
2002	193	28	
2003	244	18	
2004	157	201	
2005	191	150	
2006	283	3	

Table 2 - Annual CO₂ emissions from fires for different US regions

The annually averaged (2002-2006) CO_2 emissions (Tg yr-1), standard deviation, and the coefficient of variation for 5 regions of the LOWER48.

	Tg CO₂ yr⁻¹		
Regions	Ave. Annual Emissions	Standard Deviation	Coefficient of Variation
Western US	105	42	40
Southeastern US	65	20	31
Central US	37	10	26
Mid-Atlantic & New England	3	1	20
Midwest	3	1	17

Where

Western US = NM, CO, WY, MT, ID, UT, NV, AZ, CA, OR, WA

SE US = LA, MS, AL, FL, GA, SC, NC, TN

Central US = TX, OK, MO, KS, NB, SD, ND, IA, AR, MN

Mid-Atlantic & New England = ME, VT, NH, RI, CT, MA, NY, PA,. NJ, DE, MD, WV, VA MidWest = WI, IN, IL, OH, KY, MI

Additional files

Additional file 1

File format: DOC

Title: Emissions of CO₂ from FFB and NPP for each state.

Description: The monthly and annual averaged CO_2 emissions from each state are provided. Additionally, the FFB emissions and the annual estimated NPP are also given for each state.









Additional files provided with this submission:

Additional file 1: additional_file.doc, 186K http://www.cbmjournal.com/imedia/3682250881655734/supp1.doc