

# Baseline and Projected Future Carbon Storage and Greenhouse-Gas Fluxes in the Great Plains Region of the United States



Professional Paper 1787

**U.S. Department of the Interior**  
**U.S. Geological Survey**

**Cover.** Agricultural fields and an abandoned farmstead in eastern Montana in the Great Plains region. The Great Plains region of the United States has experienced significant land-use change since European settlement, with vast swaths of grasslands converted to agricultural lands. Access to water, technological changes, a growing biofuels industry, fluctuating demands for agricultural products, and government policies have resulted in periodic historical shifts in land use in the region and may drive major land-use changes in the next several decades. Land use and land management in the region have significant implications for carbon storage and greenhouse-gas fluxes. (Photograph by Terry Sohl.)

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By Zhiliang Zhu (editor), Michelle Bouchard, David Butman, Todd Hawbaker, Zhengpeng Li, Jinxun Liu, Shuguang Liu, Cory McDonald, Ryan Reker, Kristi Sayler, Benjamin Sleeter, Terry Sohl, Sarah Stackpoole, Anne Wein, and Zhiliang Zhu

The USGS maps how much carbon is stored in ecosystems and projects future changes using streamgage, soil, and natural-resource inventory data; remote-sensing techniques; and computer models

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**U.S. Department of the Interior**  
KEN SALAZAR, Secretary

**U.S. Geological Survey**  
Marcia K. McNutt, Director

U.S. Geological Survey, Reston, Virginia: 2011

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## Conversion Factors

Multiply	By	To obtain
	Length	
centimeter (cm)	0.3937	inch (in.)
meter (m)	3.281	foot (ft)
	Area	
square meter (m <sup>2</sup> )	10.76	square foot (ft <sup>2</sup> )
hectare (ha)	2.471	acre
square kilometer (km <sup>2</sup> )	0.3861	square miles (mi <sup>2</sup> )
	Volume	
cubic meter (m <sup>3</sup> )	35.31	cubic foot (ft <sup>3</sup> )
	Mass	
gram (g)	0.03527	ounce, avoirdupois (oz)
kilogram (kg)	2.205	pound avoirdupois (lb)
megagram (Mg) [metric ton (t)]	1.102	ton, short (2,000 lb)
teragram (Tg)	1.102 × 10 <sup>6</sup>	ton, short (2,000 lb)

Temperature in degrees Celsius (°C) may be converted to degrees Fahrenheit (°F) as follows:

$$^{\circ}\text{F} = (1.8 \times ^{\circ}\text{C}) + 32$$

The resolution of pixels in spatial datasets follows the conventions used in the spatial data and modeling communities. The format is “*n*-meter resolution,” where *n* is a numerical value for the length. The usage translates into a pixel with a length of *n* on all sides that covers an area of *n* meters × *n* meters.

## How Megagrams, Gigagrams, Teragrams, and Petagrams Relate to Metric Tons

1 megagram (Mg)	=	1 million grams (10 <sup>6</sup> g)	=	1 metric ton (t)
1 gigagram (Gg)	=	1 billion grams (10 <sup>9</sup> g)	=	1,000 metric tons
1 teragram (Tg)	=	1 trillion grams (10 <sup>12</sup> g)	=	1 million metric tons (Mt)
1 petagram (Pg)	=	1 quadrillion grams (10 <sup>15</sup> g)	=	1 billion metric tons (Gt)

## Abbreviations, Acronyms, and Chemical Symbols

<b>ARMS</b>	Agricultural Resource Management Survey
<b>C</b>	carbon
<b>CCCma CGCM3.1</b>	Canadian Centre for Climate Modelling and Analysis's Coupled Global Climate Model version 3.1
<b>CH<sub>4</sub></b>	methane
<b>CO</b>	carbon monoxide
<b>CO<sub>2</sub></b>	carbon dioxide
<b>CO<sub>2-eq</sub></b>	carbon dioxide equivalent
<b>CSIRO-Mk3.0</b>	Australia's Commonwealth Scientific and Industrial Research Organisation Mark 3.0
<b>DIC</b>	dissolved inorganic carbon
<b>EDCM</b>	Erosion-Deposition-Carbon Model
<b>EISA</b>	Energy Independence and Security Act of 2007
<b>EPA</b>	U.S. Environmental Protection Agency
<b>FIA</b>	U.S. Forest Service Forest Inventory and Analysis Program
<b>FLM</b>	fuel loading model
<b>FOFEM</b>	First Order Fire Effects Model
<b>FORE-SCE</b>	"forecasting scenarios of land cover change" model
<b>GCM</b>	Global Circulation Model
<b>GEMS</b>	General Ensemble Modeling System
<b>GHG</b>	greenhouse gas
<b>GWP</b>	global warming potential
<b>HadCM3</b>	Hadley Centre Coupled Model
<b>HR</b>	heterotrophic respiration
<b>HWP</b>	harvested wood products
<b>IMAGE 2.2</b>	Netherlands Environmental Assessment Agency's Integrated Model to Assess the Global Environment version 2.2
<b>IPCC</b>	Intergovernmental Panel on Climate Change
<b>IPCC-SRES</b>	Intergovernmental Panel on Climate Change's Special Report on Emission Scenarios
<b>k</b>	gas transfer velocity
<b>LANDFIRE</b>	Landscape Fire and Resource Management Planning Tools Project
<b>Landsat</b>	USGS and NASA Satellite Program
<b>LULC</b>	land use and land cover

<b>MIROC 3.2-medres</b>	Model for Interdisciplinary Research on Climate version 3.2, medium resolution
<b>MODIS</b>	Moderate Resolution Imaging Spectroradiometer
<b>MTBS</b>	Monitoring Trends in Burn Severity
<b>N<sub>2</sub>O</b>	nitrous oxide
<b>NCAR CCSM</b>	National Center for Atmospheric Research's Community Climate System Model
<b>NFDRS</b>	National Fire Danger Rating System
<b>NHD</b>	National Hydrography Dataset
<b>NLCD</b>	National Land Cover Database
<b>NPP</b>	net primary productivity
<b>NWIS</b>	National Water Information System
<b>PRISM</b>	parameter-elevation regressions on independent slopes model
<b>SOC</b>	soil organic carbon
<b>TOC</b>	total organic carbon
<b>USDA</b>	U.S. Department of Agriculture
<b>USGS</b>	U.S. Geological Survey



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## Executive Summary

This assessment was conducted to fulfill the requirements of section 712 of the Energy Independence and Security Act (EISA) of 2007 and to improve understanding of carbon (C) and greenhouse gas (GHG) fluxes in the Great Plains region in the central part of the United States. The assessment examined carbon storage, carbon fluxes, and other GHG fluxes (methane (CH<sub>4</sub>) and nitrous oxide (N<sub>2</sub>O)) in all major terrestrial ecosystems (forests, grasslands/shrublands, agricultural lands, and wetlands) and freshwater aquatic systems (rivers, streams, lakes, and impoundments) in two time periods: baseline (generally in the first half of the 2010s) and future (projections from baseline to 2050). The assessment was based on measured and observed data collected by the U.S. Geological Survey (USGS) and many other agencies and organizations and used remote sensing, statistical methods, and simulation models. The major findings are as follows:

- The Great Plains region (2.17 million square kilometers) is predominantly grasslands/shrublands (48 percent of the total area) and agricultural lands (42 percent). Forests (5.35 percent), wetlands (1.4 percent), water bodies (1.16 percent), and other lands (developed and barren lands, 1.73 percent) complete the rest of land cover in the region. Land-use and land-cover (LULC) change is a major driver of changes in carbon storage. Future LULC change in the

region, projected using the Intergovernmental Panel on Climate Change (IPCC) scenarios, is largely driven by the demand for agricultural commodities (including biofuels), resulting in the significant expansion of agricultural land (1.4 to 9.2 percent of the total area by 2050, depending upon which scenario is used in the calculation) at the expense of grasslands/shrublands (–2.2 to –9.3 percent) and forests (0.0 to –0.5 percent).

- Greenhouse-gas emissions from natural and manmade wildland fires are a key component of the assessment. The amount of area burned and the GHG emissions for the Great Plains region are highly variable both spatially and temporally, but the estimates for the amount of area burned are not expected to increase substantially over time, and the resulting GHG emissions are expected to increase just slightly for a range of climate projections. Grassland fires are the most common type of fire in the region, and they yield average GHG emissions (including carbon monoxide (CO), carbon dioxide (CO<sub>2</sub>), and methane (CH<sub>4</sub>)) of 0.18 to 24.72 teragrams of carbon-dioxide equivalents per year (TgCO<sub>2-eq</sub>/yr). Currently, the national GHG inventory report by the U.S. Environmental Protection Agency (EPA) does not include data on the emissions from fires in grasslands/shrublands areas. If included, fire emissions could increase by up to 8 percent of the current reported amount for the Nation.
- The total area covered by aquatic systems in the Great Plains region is small (1.16 percent); however, lateral transfer over the water surface ranged from 0.07 to 0.31 teragrams of carbon per year (TgC/yr) within the region, and vertical evasion into the atmosphere emitted 12.8 to 24.6 TgC/yr as CO<sub>2</sub> from rivers, streams, lakes, and impoundments. Because the methods used to estimate aquatic fluxes are not explicitly coupled with methods used to calculate terrestrial estimates, it is uncertain how much of the aquatic fluxes actually may stem from terrestrial sources.

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## 2 Baseline and Projected Future Carbon Storage and Greenhouse-Gas Fluxes in the Great Plains Region

- The baseline (average of 2001–2005) carbon stock estimate for terrestrial ecosystems in the Great Plains region is approximately 7,500 TgC (only the top 20 centimeters (cm) of the soil layer was considered with regard to soil organic carbon), which is distributed in agricultural lands (45.8 percent), grasslands/shrublands (34.9 percent), forests (15.5 percent), wetlands (2.9 percent), and other lands (0.9 percent). On average, the terrestrial ecosystems in the region sequestered carbon at a rate between 20 and 99 TgC/yr during 2001 to 2005, or between 3 and 13 percent of the region's net primary production.
- By 2050, the total potential carbon stock for terrestrial ecosystems in the region is projected to increase to a range of 9,665 to 10,228 TgC, depending on the projection scenarios. The increase in carbon stock translates to a potential total sequestration of 2,165 to 2,728 TgC between baseline and 2050, or a mean annual sequestration of 48 to 61 TgC. The projected amount of carbon that would be stored by 2050 for the region is distributed in agricultural lands (47 percent), grasslands/shrublands (29 percent), forests (20.4 percent), wetlands (2.9 percent), and other lands (0.75 percent). Two factors—(1) the projected expansion of agricultural lands and (2) the tendency of croplands in the region to be associated with favorable ecosystem conditions (such as fertile soil and temperate climate, which lead to relatively high soil carbon stock)—explain why agricultural lands may still contain the most carbon stocks by 2050. The increase of forest carbon density and sequestration are projected on existing forests owing to the effects of CO<sub>2</sub> fertilization and a projected low level of forest harvesting. Temporally, the rate of sequestration is expected to remain steady and decrease slightly over the projection period as the result of the projected increased LULC change and climate change.
- Methane (CH<sub>4</sub>) emissions from wetlands and nitrous oxide (N<sub>2</sub>O) emissions from agricultural lands are high for the Great Plains region. When combined, they yield a baseline total of 240 TgCO<sub>2-eq</sub>/yr (82 TgCO<sub>2-eq</sub>/yr from CH<sub>4</sub> and 158 TgCO<sub>2-eq</sub>/yr from N<sub>2</sub>O). By 2050, N<sub>2</sub>O emissions are expected to increase by 7 to 11 percent. The expected change of CH<sub>4</sub> emissions will range from a slight decrease of 1.6 percent to an increase of 16 percent. Up to 85 percent of the amount of GHG emissions may be offset by carbon sequestration in the region.
- Carbon storage and sequestration are affected by LULC and LULC change in the Great Plains region. Conversions between major ecosystems (for example, removing grassland/shrublands and forests to make way for agricultural lands) may lead to a cumulative reduction in stored carbon between 26 and 157 TgC from the baseline to 2050 (depending on the scenario), or up to a 4 percent loss of the mean total carbon sequestration of the region during the same time period. Although afforestation in the region may result in a small increase in the total carbon stock, the potential loss of carbon from the conversion of forests to agricultural land is much greater. The loss of carbon storage may be most noticeable in the northern portion of the region because of the relatively lower agricultural productivity and increasingly drier soils.
- Climate is another important factor affecting carbon storage and sequestration in the Great Plains region. Although climate projections were simulated for the IPCC scenarios, the effects of climate fluctuations and change have not yet been fully examined. The effects of climate change in the region may include droughts (such as those that occurred between 2002 and 2003), floods (such as those in 2011), as well as fluctuations in temperature and moisture availabilities, which could change the direction of carbon sequestration by the region's ecosystems.
- Uncertainties in the assessment results remain high because of (1) insufficient input data for various components of the assessment, and (2) inherent uncertainty related to the structure and the parameterization of methods and models that were used in the assessment. An improved approach that would integrate all the major uncertainty elements is needed for future assessments.
- This assessment provides new data and maps to users showing where carbon storage opportunities and vulnerabilities are located and how they are distributed over time. Within the limits of the resolution of a national assessment, the data and maps may be used to inform climate change mitigation and adaptation decisions while empowering the protection and restoration of other valuable ecological services that are important to society's welfare and quality of life. Suggested strategies to enhance carbon storage in the Great Plains region include conserving natural land cover (such as forests and grasslands/shrublands) and finding ways to reduce nitrous oxide and methane emissions in agricultural lands or wetlands while maintaining their productive sequestration.

## Introduction

This is the first of a series of reports that assess carbon sequestration and greenhouse-gas (GHG) fluxes in regional ecosystems; this report covers the Great Plains region of the United States. The assessment has two specific objectives: (1) fulfill the requirements of the 2007 Energy Independence and Security Act (EISA; U.S. Congress, 2007), section 712, which directs the Department of the Interior to examine the major ecosystems in all 50 states of the Nation and estimate the amount of and changes in carbon storage and GHG (carbon dioxide (CO<sub>2</sub>), methane (CH<sub>4</sub>), and nitrous oxide (N<sub>2</sub>O)) fluxes in and out of ecosystems and evaluate the effects of major controlling processes such as climate change, land use, and wildfire on ecosystems; and (2) improve the understanding of the capacity and vulnerability of carbon storage and sequestration in ecosystems in a spatially and temporally meaningful fashion by using the technical capabilities of the U.S. Geological Survey (USGS) and other agencies and organizations

This regional assessment was conducted using the methodology of Zhu and others (2010), which was based on the integrated use of remote sensing, existing resource and soil inventories, data collected specifically for the assessment, statistical analyses, and empirical and process-based modeling. Unless noted specifically in this report or in references cited, the major input datasets, methods, and models are described in the methodology (Zhu and others, 2010). The national assessment is organized by five major ecosystems: four terrestrial ecosystems (including forests, grasslands/shrublands, wetlands, and agricultural lands), and one aquatic ecosystem (including rivers, lakes, impoundments, estuaries, and coastal waters<sup>9</sup>). The thematic definitions of the ecosystems and their spatial boundaries are outlined in Zhu and others (2010).

The assessment accounts for the current (baseline) and future projected changes in carbon and GHG fluxes. Following standard conventions found in the literature on this topic, negative values for carbon fluxes denote carbon uptake, or sequestration, unless noted otherwise. The term “baseline” is defined as the average current annual conditions to be assessed. Different components of the assessment have different baseline years, which are limited by input data characteristics: land use and land cover (LULC, 1992–2005), wildland fires (2001–2008), terrestrial carbon and GHG fluxes (2001–2005), and aquatic carbon fluxes (1970s to present). The input datasets used for the assessment include those developed by the USGS and other agencies and organizations. The output datasets are in the form of either annual digital maps (250-meter (m) resolution) or annual statistics. Because the assessment was conducted at national and broad regional scales, the resulting information and data products should be applied and (or) used only at the regional scale or broader.

<sup>9</sup>Estuaries and coastal waters are not included in this assessment of the Great Plains region.

## Ecosystems of the Great Plains Region

The Great Plains region is divided into three U.S. Environmental Protection Agency (EPA) Level II ecoregions: the Temperate Prairies, the West-Central Semi-Arid Prairies, and the South-Central Semi-Arid Prairies (EPA, 1999) (fig. 1). The Great Plains region is characterized by generally flat to gently rolling topography, with a moderately humid climate in the east that gradually transitions to moderately dry conditions in the western Great Plains. A strong temperature gradient also exists; during the winter, bitterly cold temperatures prevail in the north while the south is characterized by mild and pleasant temperatures. The dominant natural vegetation is tied to the precipitation gradient: shortgrass steppe in the dry western part of the region, mixed-grass prairie in the central part, tallgrass prairie in the moderately humid east, and woodlands in the south and east (Burke and others, 1991).

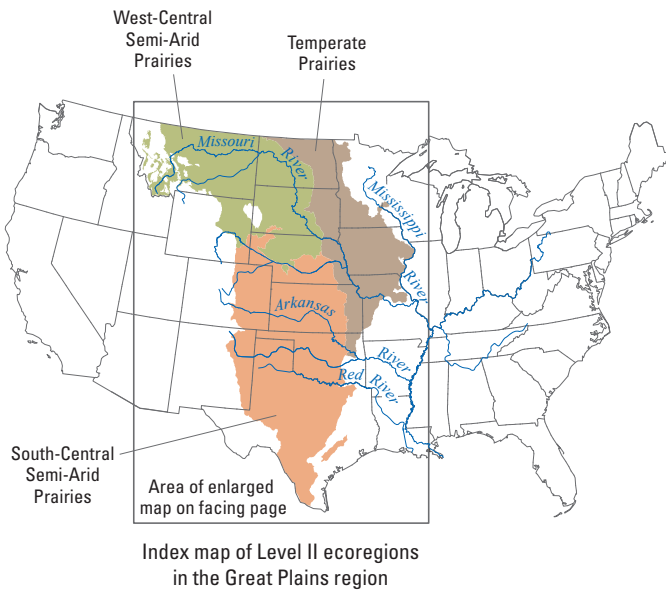
The hydrology of the northern portion of the Great Plains region is dominated by the Missouri River basin, which is the second largest watershed in the United States and drains about one-sixth of the conterminous United States (Galat and others, 2005). The southern portion is dominated by the drainage basins of the Arkansas and the Red Rivers, which flow from the northwest to the southeast and are tributaries to the Mississippi River (Matthews and others, 2005). With some exceptions (for example, the Prairie Pothole region), the vast majority of enclosed water bodies in the Great Plains region are manmade. The main stem of the Missouri River houses the largest reservoir system in North America (Roth, 2005), and the region contains a high density of small ponds and impoundments as well.

The native grasslands of the Great Plains are one of the most endangered ecosystems in North America (Cully and others, 2003; Samson and others, 2004) and have undergone the greatest reduction in size of any ecosystem in North America (Samson and Knopf, 1994). Between 60 and 70 percent of the eastern Great Plains has been plowed and cultivated, compared with slightly less than 30 percent of the western Great Plains (Hartman and others, 2011). Only 1 percent of the original tallgrass prairie remains in the region (Cully and others, 2003). Water availability is the most important driver of land use in the Great Plains. Nearly 20 billion gallons of water are pumped from the High Plains aquifer every day for irrigation and drinking water (Karl and others, 2009). The dramatic growth of irrigated agriculture since 1960 represents a major human-induced hydrologic change in North America (Moore and Rojstaczer, 2001). LULC change and intensive land-management practices have had significant impacts on native plants and animals (Samson and Knopf, 1996; Higgins and others, 2002), nutrient cycling (Fleischner, 1994), and carbon and GHG fluxes (Fuhlendorf and others, 2002).



#### 4 Baseline and Projected Future Carbon Storage and Greenhouse-Gas Fluxes in the Great Plains Region





**EXPLANATION**

<b>Land cover</b>		<b>South-Central Semi-Arid Prairies</b>	
<span style="color: blue;">■</span> Water		WHP	Western High Plains
<span style="color: red;">■</span> Developed		ST	Southwest Tablelands
<span style="color: purple;">■</span> Logging		CGP	Central Great Plains
<span style="color: brown;">■</span> Mining		FH	Flint Hills
<span style="color: lightgrey;">■</span> Barren		COTP	Central Oklahoma/Texas Plains
<span style="color: green;">■</span> Deciduous forest		EP	Edwards Plateau
<span style="color: darkgreen;">■</span> Evergreen forest		STP	Southern Texas Plains
<span style="color: cyan;">■</span> Mixed forest		TBP	Texas Blackland Prairies
<span style="color: olive;">■</span> Grassland		<b>Temperate Prairies</b>	
<span style="color: tan;">■</span> Shrubland		CIP	Central Irregular Plains
<span style="color: orange;">■</span> Cultivated crops		NGLP	Northern Glaciated Plains
<span style="color: yellow;">■</span> Hay/pasture		WCBP	Western Corn Belt Plains
<span style="color: lightgreen;">■</span> Herbaceous wetlands		LAP	Lake Agassiz Plain
<span style="color: teal;">■</span> Woody wetlands		<b>West-Central Semi-Arid Prairies</b>	
<b>Ecoregion boundary</b>		NWGLP	Northwestern Glaciated Plains
— Level II		NGP	Northwestern Great Plains
— Level III		NSH	Nebraska Sand Hills

**Figure 1 (pages 4 and 5).** Map showing the spatial extent of this assessment. The Great Plains region consists of 3 EPA Level II ecoregions (the Temperate Prairies, the West-Central Semi-Arid Prairies, and the South-Central Semi-Arid Prairies), which in turn consist of 16 Level III ecoregions (modified from EPA, 1999). The total area of the Great Plains region is approximately 2.17 million square kilometers. The land-use and land-cover classes shown on the map represent conditions that existed around 2005.

Estimates of carbon storage, sequestration, and GHG fluxes vary widely by ecosystems in the region. The estimates for the conterminous United States and coastal Alaska provided in the annual national GHG inventory report (EPA, 2011a) suggest an average annual net carbon flux of  $-2.36 \text{ TgC/yr}$  for grasslands remaining as grasslands,  $-6.56 \text{ TgC/yr}$  for lands converted to grasslands, or a combined  $-8.92 \text{ TgC/yr}$  for grasslands. Using data from 15 flux towers variously located in grassland areas of the Great Plains between 2000 and 2008, Zhang and others (2011) showed that the annual net flux density ranged from  $-10$  to  $-38$  grams of carbon per square meter per year ( $\text{gC/m}^2/\text{yr}$ ); by extrapolating the density value to the total area of grasslands in the region (derived from the USGS National Land Cover Database (NCLD); Homer and others, 2007), the annual total flux ranged from approximately  $-12.96$  to  $-49.24 \text{ TgC/yr}$  (mean value of  $-31.1 \text{ TgC/yr}$ ). For croplands, the EPA estimated an annual net flux of  $-5.05 \text{ TgC/yr}$  (for croplands that remained as croplands),  $1.61 \text{ TgC/yr}$  (for other lands converted to croplands), or a combined annual net flux of  $-3.44 \text{ TgC/yr}$ . West and others (2010) determined that the net ecosystem carbon balance in 2004 for croplands in the region ranged from a high of  $-48 \text{ gC/m}^2$  on more productive lands to as low as  $60 \text{ gC/m}^2$  on drier lands.

Using data derived from its forest inventory and accounting for all the major carbon pools in the region, the U.S. Department of Agriculture (USDA) Forest Service reported that (1) carbon stored in the region's forests in 2010 averaged 471, 279, and 1,346 TgC respectively, for the Temperate Prairies, the West-Central Semi-Arid Prairies, and the South-Central Semi-Arid Prairies; and (2) the average carbon stock density for the region's forests was 104 megagrams of carbon per hectare ( $\text{MgC/ha}$ ), or 10.4 kilograms of carbon per square meter ( $\text{kgC/m}^2$ ) (USDA, 2011). Estimates of regional carbon and GHG flux rates for wetlands generally are not found in existing literature. Studies conducted by the USGS (Gleason and others, 2005; Euliss and others 2006) found that the restoration of Prairie Pothole wetlands from croplands may result in an increase in soil organic carbon sequestration by up to 187 Tg for the region ( $2.75 \text{ MgC/ha}$ ) within 10 years of restoration without incurring increased emissions of GHG ( $\text{CO}_2$ ,  $\text{CH}_4$ , and  $\text{N}_2\text{O}$ ) (Gleason and others, 2009). Regional studies reporting  $\text{CO}_2$  fluxes from aquatic ecosystems in the Great Plains region are not currently available, but a study by Raymond and Oh (2007) reported that the Missouri River yielded from  $1.5$  to  $3.5 \text{ gC/m}^2/\text{yr}$  for dissolved inorganic carbon (DIC) and from  $0.2$  to  $2.0 \text{ gC/m}^2/\text{yr}$  for total organic carbon (TOC).

## Land-Use and Land-Cover Changes in the Great Plains Region

As part of the methodology, spatial and temporal distributions of current and projected future LULC changes were designed to be a foundation for the assessment (Zhu and others 2010). The baseline LULC data were derived from a slightly modified version of the 1992 NLCD (Vogelmann and others, 2001). The thematic classification framework for LULC nests within the primary ecosystems (Zhu and others 2010) and provide enough within-ecosystem thematic details to better inform the accounting and analysis of carbon stocks and GHG fluxes using biogeochemical models. The LULC from 1992 to 2005 was modeled and calibrated using historical LULC data from the USGS Land Cover Trends project (Loveland and others, 2002) to produce annual maps of LULC change from 1992 to 2000. LULC data from the 2001 and 2006 NLCD (Homer and others, 2007) were used to map LULC change from 2001 to 2005. Mapping of LULC change between 1992 and 2005 also incorporated annual changes to forested areas due to forest harvesting; this information was derived from Landsat data and a vegetation change tracker, (a remote-sensing model) (Huang and others, 2010).

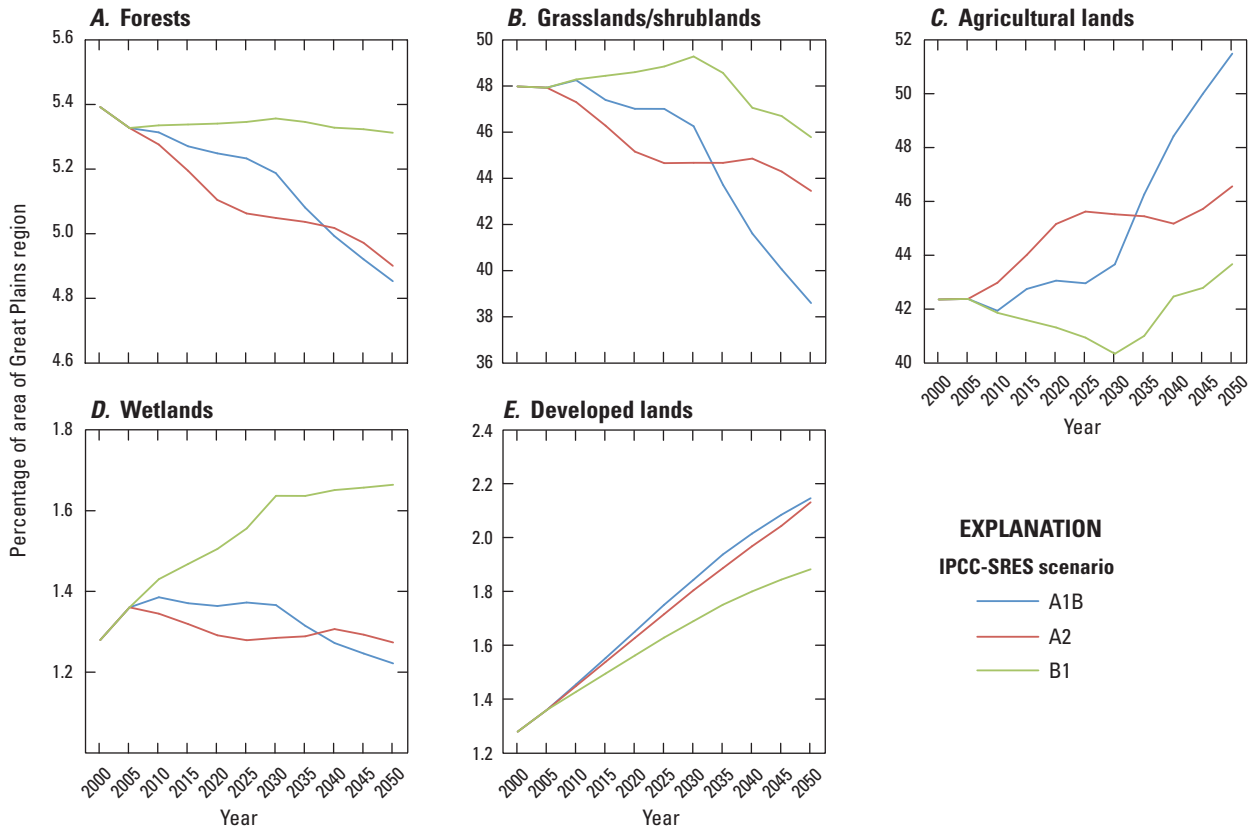
Scenario-based modeling of LULC change (between 2006 and 2050) is designed to provide an overall framework within which to assess projected carbon sequestration capacity and vulnerability, as well as uncertainty. Future scenarios of LULC change were developed through a hierarchical downscaling process using a spreadsheet accounting model (Zhu and others, 2010; Benjamin Sleeter, unpub. data, 2011). The development of future LULC-change scenarios at both the national and regional scales began with (1) scenarios A1B, A2, B1, and B2, which are defined in the Intergovernmental Panel on Climate Change (IPCC) Special Report on Emission Scenarios (SRES) (IPCC-SRES; Nakicenovic and others, 2000) and (2) model simulation results from the Integrated Model to Assess the Global Environment (IMAGE) 2.2 (Strengers and others, 2004). The IMAGE model produced projections of major land-use types, including agriculture and forest harvest. Future projections of developed lands (such as urban areas) and mining lands were estimated through the use of proxy data from IMAGE (population and coal usage, respectively). Other LULC classes were evaluated based on land-use histories and expert judgment.

Because the IPCC-SRES scenarios span a wide range of socioeconomic conditions, the results of the downscaling process produced a wide range of future LULC and corresponding ecosystem conditions in the Great Plains region (fig. 2). For this assessment, three of the four available IPCC-SRES scenarios (A1B, A2, and B1) were used. The main assumptions that the IPCC used to develop these three scenarios (and the subsequent modeled results of future climate-change projections) are summarized in table 1.

The regional LULC scenarios, developed using the approach described above, were used to guide a spatially explicit “forecasting scenarios of land-cover change” (FORE-SCE) model to project future LULC distributions (Sohl and others, 2007; Sohl and Saylor, 2008). The FORE-SCE model used logistic regression to quantify empirical relationships between land cover and spatially explicit biophysical and socioeconomic variables. The results were probability surfaces that quantified the suitability for each land-cover type being modeled. A unique landscape-level patch-by-patch modeling procedure was then used to place patches of LULC change in suitable areas on the landscape; historical LULC-change data and other biophysical data were used to generate realistic patch sizes and configurations for each region. Other biophysical datasets included a recently developed potential wetland map (Kristin Byrd, USGS, unpub. data, 2011) using USDA soil survey databases (USDA Natural Resources Conservation Service, 2006, 2009). Each Level III ecoregion in figure 1 was individually parameterized and modeled with FORE-SCE for each of the three IPCC-SRES scenarios. The 1992 to 2005 period was used to present baseline conditions, using as much observed and actual LULC and remotely sensed data as possible, as described above. The 2006 to 2050 modeled LULC provided spatial representations of the IPCC-SRES scenarios. When combined, the baseline and modeled scenarios resulted in a continuous, consistent LULC map database from 1992 to 2050, which was then collapsed to form the primary ecosystems as outlined in Zhu and others (2010) (fig. 2).

The validation of the LULC modeling results for the Great Plains region focused on examining quantity agreement (how well the model represented observed data for baseline and scenario-based prescriptions for future changes), and location agreement (how well the model placed LULC change). Quantity agreement was excellent, with FORE-SCE almost exactly matching the recent 1992 to 2005 LULC proportions as well as the projected scenario LULC proportions through 2050. Quantitatively assessing the location agreement using the recent data from 1992 to 2005 was complicated by thematic resolution differences, the very small amount of LULC change from 1992 to 2005, and the attempt to compare a sampled LULC dataset (USGS Land Cover Trends; Loveland and others, 2000) to a wall-to-wall modeled product. LULC processes are not stationary, which makes the assessment of model performance questionable for LULC projections (Pontius and Neeti, 2010). In lieu of a quantitative assessment, qualitative assessments of model performance were conducted using panel reviews by regional LULC experts. The experts reviewed both the model parameters and the model output for consistency with the scenario-based storylines, after which models were adjusted and iterative model runs were conducted until the model output was judged to adequately reflect the scenario-based storylines.





**Figure 2.** Graphs showing the distributions of the four primary terrestrial ecosystems and developed lands of the Great Plains region projected over time for each of the IPCC-SRES scenarios—A1B, A2, and B1 (from the Intergovernmental Panel on Climate Change’s Special Report on Emission Scenarios (IPCC-SRES); Nakicenovic and others, 2000). *A*, Forests; *B*, Grasslands/shrublands. *C*, Agricultural lands. *D*, Wetlands. *E*, Developed lands. The Great Plains region (total area approximately 2.17 million square kilometers) is dominated by the natural land covers of grass and shrubs and the agricultural covers of cultivated crops, hay, and pasture. Agricultural lands are projected to expand significantly under both the A1B and A2 scenarios because of projected increased

crop demands (A1B and A2) and hay and pasture demand for cellulosic biofuel (A1B). These expansions are in contrast to the projected declines in the amount of area covered by grasslands/shrublands or forests under the A1B and A2 scenarios. Under the B1 scenario, the amount of area covered by agricultural lands is projected to decrease for the first half of the timeline (baseline years through 2030) and then to increase in the latter half (2030–2050); additionally, (1) the amount of area covered by wetlands is projected to increase, and (2) compared to other scenarios, the amount of area covered by forests and grasslands/shrublands is projected to remain steady throughout the middle of the timeline and decrease toward 2050. Note that the scale of the y-axis is different for each graph.

**Table 1.** Assumptions about primary driving forces affecting land-use and land-cover change. These assumptions were used to downscale the A1B, A2, and B1 scenarios of the Intergovernmental Panel for Climate Change’s Special Report on Emission Scenarios (Nakicenovic and others, 2000).

Driving forces	A1B	A2	B1
Population growth (global and United States)	Medium; 8.7 billion by 2050, then declining; in the United States, 385 million by 2050	High; 15.1 billion by 2100; in the United States, 417 million by 2050	Medium; 8.7 billion by 2050, then declining; in the United States, 385 million by 2050.
Economic growth	Very high; U.S. gross domestic product \$72,531 by 2050	Medium; U.S. gross domestic product \$47,766 by 2050	High; U.S. gross domestic product \$59,880 by 2050.
Regional or global orientation	Global	Regional	Global.
Technical innovation	Rapid	Slow	Rapid.
Energy sector	Balanced use	Adaptation to local resources	Smooth transition to renewable.
Environmental protection	Active management	Local and regional focus	Protection of biodiversity.

## Projected Climate Change in the Great Plains Region

The projected long-term future climate change in the Great Plains is highly variable but includes the likelihood of higher temperatures, higher precipitation in the north, lower precipitation in the south, and increases in extreme events such as flooding, drought, and heat waves (Karl and others, 2009). Five global circulation models (GCMs) were used in the fire disturbance modeling: (1) Australia's Commonwealth Scientific and Industrial Research Organization Mark 3.0 (CSIRO-Mk3.0), (2) the Canadian Centre for Climate Modelling and Analysis's Coupled Global Climate Model version 3.1 (CCCma CGCM3.1), (3) the (Japanese) National Institute for Environmental Studies' medium-resolution version of their Model for Interdisciplinary Research on Climate, version 3.2 (MIROC 3.2-medres), (4) the National Center for Atmospheric Research's Community Climate System Model version 3.0 (NCAR CCSM 3.0), and (5) the United Kingdom's Hadley Centre Coupled Model version 3 (HadCM3) (Wood and others, 2002, 2004; Maurer, 2007). The MIROC 3.2-medres GCM was used in the biogeochemical modeling of the region. The MIROC 3.2-medres GCM is representative of the above-noted trends for temperature and precipitation changes that are derived by comparing average annual temperatures from 1970 to 2010 and from 2010 to 2050, although the changes are variable across the scenarios. In particular, the MIROC 3.2-medres GCM projects annual average temperature increases of up to 2.4 degrees Celsius (°C) in the central part of the Great Plains region under the B1 scenario. Although there is less change in the annual average precipitation throughout the region under the B1 scenario, the climate under the A2 scenario is projected to be drier throughout the Great Plains region. For each of the three IPCC-SRES scenarios, the MIROC 3.2-medres GCM projects greater reductions in annual precipitation in the southeastern part of the Great Plains region.

## Wildland Fire and Emissions in the Great Plains Region

Historically, fire has played a large role in shaping the composition, structure, and function of ecosystems in the Great Plains region (Collins and Wallace, 1990). Fire occurrences have been highly variable through time and are dependent on climate, land-use and land-cover changes, and human activity (Clark, 1990; Umbanhowar, 1996). Before European settlement, fires often were intentionally set by Native Americans, in addition to natural fires caused by lightning. In modern times, wildfires are infrequent, but still occur. Fires that are prescribed as part of land-management activities in both grasslands/shrublands and

agricultural lands are common (McCarty and others, 2009; Tulbure and others, 2011), but data that would accurately characterize prescribed fires are not available; therefore, only wildland fires were analyzed for this assessment.

The baseline (observed) data for the amount of area burned and for emissions by wildfires were derived from the Monitoring Trends in Burn Severity database (MTBS; Eidenshink and others, 2007), which only mapped large fires (202 ha or larger east of the Mississippi River, 405 ha or larger in the western United States and Alaska) derived from Landsat imagery. The MTBS data were selected because of the high degree of confidence in the data: each fire is individually examined. Various versions of Federal fire databases are available but were not used because of the spatial inaccuracies and duplicate records that would have introduced uncertainties into results (Brown and others, 2002). Data on active fires (Giglio and others, 2003) and burned areas (Roy and others, 2008), which were detected by the Moderate Resolution Imaging Spectroradiometer (MODIS) satellite, were considered but were not used because they contained no information about the causes of the fires and they had a coarse spatial resolution that complicated the modeling of future trends.

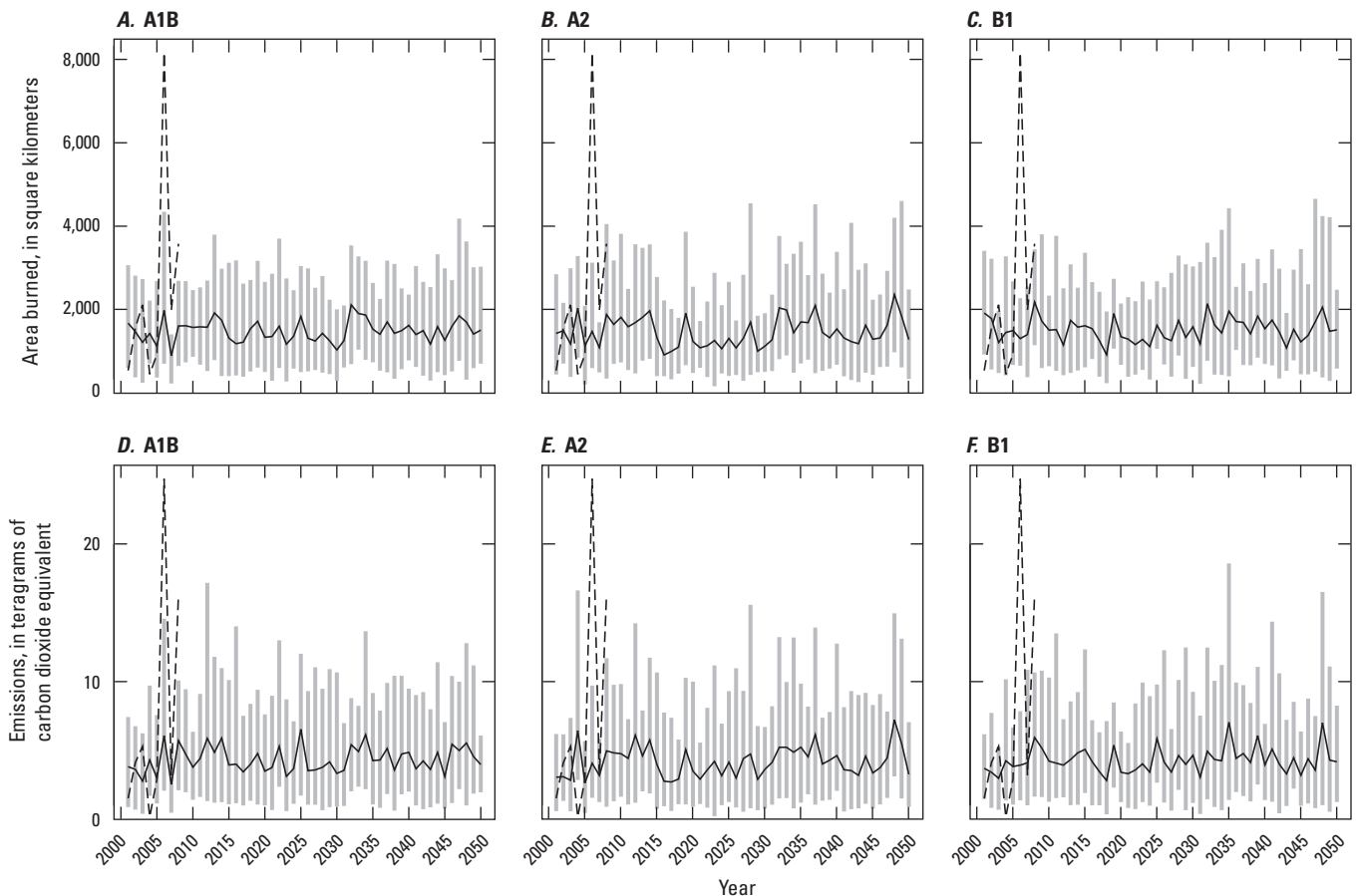
Fire emissions were calculated for each MTBS fire using the First Order Fire Effects Model (FOFEM; Reinhardt and others, 1997) for each major fire-relevant GHG: CO<sub>2</sub>, CO, and CH<sub>4</sub>. FOFEM requires data on weather conditions, fuel-moisture contents, and fuel loads. The fuel moisture content was estimated by using the National Fire Danger Rating System (NFDRS; Bradshaw and others, 1983), which is based on a 12-kilometer (km)-resolution, gridded daily weather dataset that spans the conterminous United States from 1980 to 2000 (Maurer and others, 2002). The fuel-load data were derived from the Landscape Fire and Resource Management Planning Tool Project's (LANDFIRE's) Fuel Loading Models layer (FLM; Lutes and others, 2009). Because the LANDFIRE fuels data derived from Landsat imagery reflected conditions around 2001 and after, and the MTBS data cover years between 1985 and 2008, fires occurring between 2001 and 2008 were included as the baseline for fire estimates.

Simulations of the amount of area burned by fire and the corresponding emissions were run for 2001 to 2050 under each of the IPCC-SRES scenarios (A1B, A2, and B1; Nakicenovic and others, 2000). The simulation results for 2001 to 2008 were used for validation or for comparison with baseline information, whereas the results from 2011 to 2050 were used to analyze the projected changes in burned area and emissions under each scenario over time. First, for the simulations, a probability of fire occurrence was calculated using logistic regression as well as the baseline data on daily weather conditions, fuel-moisture content, vegetation types, and fuel types. Next, future daily weather sequences were generated by temporally disaggregating monthly bias-corrected and spatially downscaled climate-change projections from the five GCMs (CSIRO-Mk3.0, CCCma CGCM3.1, MIROC 3.2-medres, NCAR CCSM 3.0,

and HadCM3) (Wood and others, 2002, 2004; Maurer, 2007) with the historical daily weather data (1980–2000) used for the baseline assessment. The daily weather sequences were processed using the NFDRS algorithms to produce daily fuel moisture contents for each GCM and IPCC-SRES scenario combination. These data were used with the logistic regression to project future patterns of fire ignition. To quantify the future potential burned area, each fire's spread was simulated using the minimum travel time algorithm (Finney, 2002) with the projected ignition locations, daily weather, and LANDFIRE fuel, and topography layers (Rollins, 2009). In the models, fires were allowed to spread between 1 and 14 days, depending on recent burn durations for each ecoregion. A containment algorithm was also applied to each fire to limit the total fire size (Finney and others, 2009). After the burned area of each fire was established, the emissions were calculated using FOFEM. To quantify uncertainty in the future projected burned area and emissions, five replicate simulations were

run for each IPCC-SRES scenario and GCM combination for a total of 75 simulations (fig. 3, table 2).

Comparisons of the simulated scenario data with the observed data in MTBS on the amount of area burned and resulting fire emissions indicate that the simulated annual burned areas and emissions from 2001 to 2010 were generally lower than the observed annual burned area and emissions from 2001 to 2008. The maximum simulated area burned from 2001 to 2010 was 4,414 square kilometers ( $\text{km}^2$ ) under the B1 scenario, which was nearly half of the observed maximum of 8,159  $\text{km}^2$  (table 2). These differences were primarily because the simulations did not generate burned areas as extreme as that which was observed in 2006, which indicates that the model may underestimate the potential influence of extreme fire years; however, the differences in mean area burned between the observed and simulated values were not substantial based on 2-sided t-tests, with p-values of 0.33, 0.34, and 0.37, for scenarios A1B, A2, and B1, respectively.



**Figure 3.** Graphs showing the trends of baseline and simulated projected future burned area due to wildland fires and their emissions for each of the three IPCC-SRES scenarios (Nakicenovic and others, 2000), by year, in the Great Plains region. *A*, Area burned under the A1B scenario. *B*, Area burned under the A2 scenario. *C*, Area burned under the B1 scenario. *D*, Emissions from fire under the A1B scenario. *E*, Emissions from fire under the A2 scenario. *F*, Emissions from fire under the B1 scenario. The baseline values from Monitoring Trends in Burn Severity (MTBS) data are shown as dashed black lines. Each gray line represents a range of projected future estimates for 25 simulations (5 global change models  $\times$  5 replicates). The mean values of the simulated projected future estimates are shown as solid black lines.

**Table 2.** Ranges of annual baseline (observed) values and projected future estimates for the amount of area burned by wildland fires and their emissions, by IPCC-SRES scenario and assessment year, for the Great Plains region.

[Baseline data is from the Monitoring Trends in Burn Severity (MTBS) database. Projected future estimates were derived from the simulation modeling process described above. Carbon-dioxide equivalents include the three major fire-relevant greenhouse gases: CO, CO<sub>2</sub>, and CH<sub>4</sub>. IPCC-SRES, Intergovernmental Panel on Climate Change's Special Report on Emissions Scenarios (Nakicenovic and others, 2000); km<sup>2</sup>/yr, square kilometers per year; TgCO<sub>2-eq</sub>/yr, teragrams of carbon-dioxide equivalent per year]

Scenarios	Years	Area burned (minimum to maximum, in km <sup>2</sup> /yr)	Emissions (minimum to maximum, in TgCO <sub>2-eq</sub> /yr)
Baseline (observed)	2001–2008	543–8,159	0.18–24.72
A1B	2001–2010	187–2,614	0.42–10.82
	2011–2020	146–3,041	0.47–16.92
	2021–2030	176–2,474	0.54–10.59
	2031–2040	202–2,493	0.36–9.88
	2041–2050	242–2,373	0.60–11.92
A2	2001–2010	170–2,746	0.33–9.52
	2011–2020	270–2,272	0.62–10.01
	2021–2030	132–3,882	0.27–14.54
	2031–2040	219–3,264	0.45–9.11
	2041–2050	245–2,826	0.59–11.70
B1	2001–2010	264–3,150	0.41–10.63
	2011–2020	197–4,414	0.39–12.93
	2021–2030	195–3,167	0.45–10.89
	2031–2040	169–3,165	0.45–13.41
	2041–2050	211–4,332	0.41–10.40

## Land Management in the Great Plains Region

An objective of this assessment is to analyze the effects of land-management activities on carbon storage and GHG fluxes. Land-management activities are defined as those actions that change the way land is used; for instance, land-management activities may help farmers make land more productive, or help ranchers conserve their water resources. For this assessment, land-management activities were aligned with the LULC classes that make up the four terrestrial ecosystems, such as tillage practices for agricultural lands. For the Great Plains regional assessment, land-management variables from agricultural census data and other data sources were downscaled and mapped to pixel scale using a Monte Carlo statistical procedure (G.S. Schmidt, USGS, unpub. data, 2011), as follows:

- Crop production was modeled by each IPCC-SRES scenario (Nakicenovic and others, 2000) using (1) the LULC maps described previously, (2) the Netherlands Environmental Assessment Agency's Integrated Model to Assess the Global Environment version 2.2 (IMAGE 2.2) (Strengers and others, 2004), and (3) USDA crop data (Padgitt and others, 2000);
- USDA National Agricultural Statistics Service, 2011). Crop types and rotation probability were derived from the same USDA data and used to downscale the general class of "cropland" from LULC (as part of the agricultural lands ecosystem) to various crops.
- Tillage practices (no tillage, conventional tillage, reduced tillage) were downscaled from the tillage information provided by the USDA's Agricultural Research Management Survey (ARMS) database (USDA Economic Research Service, 2011b), by crop type. Because of the lack of data on future projections, the projected tillage practice data were assumed to remain the same as the baseline data.
- An irrigation map was derived from MODIS imagery (USGS, 2002). The projected irrigation data were assumed to remain the same as the baseline data.
- Data on fertilizer use were derived from a USDA database (USDA Economic Research Service, 2011a). Fertilization was assumed to be optimal, thus satisfying the requirement for future plant growth. This assumption was based on the observation that the current levels of fertilization in the United States can largely satisfy the nutrient needs for crop growth.

- Data on the addition of manure to crops, which directly adds carbon into ecosystems in addition to providing nutrients, were derived from USDA's ARMS database (USDA Economic Research Service, 2011b) for all crop types.
- There are no national data on rangeland grazing, which would help determine the grazing intensity on grasslands/shrublands. In this assessment, it was assumed that all grasslands/shrublands in the region would be grazed during the summer. An average grazing intensity was calculated based on data from Holland and others (1992) to produce a mean value ranging from 0.2 to 1.4 Animal Unit Month/ha. This range of mean values was comparable with other reported grazing intensity measurements in the literature (Biondini and others, 1998; Schuman and others, 1999; Derner and others, 2006). The total carbon removal by livestock grazing in the region was calculated using a USDA livestock inventory and empirical factors in rangeland management, with the assumption that the carbon removal values would meet about 70 percent of the total carbon consumption needs by livestock (Holechek and others, 2000; USDA National Agricultural Statistics Service, 2011).
- Estimates of fire extent and severity, produced as part of the assessment as described previously, were used to assess the effects of fire on carbon sequestration. The effects of fire on carbon sequestration were simulated at annual increments with three burn-severity classes: high, moderate, or low.
- There were no national data available about crop-residue management. Assumptions were made for the amount of aboveground biomass that was removed, by crop type. For example, it was assumed that the crop type "corn for silage" would have 80 to 90 percent of its aboveground biomass (corn plus residue) removed, whereas "corn for grain" would only have the corn removed and all the residue left in the field.
- Information about the age of forests in the region was derived from the U.S. Forest Service's Forest Inventory and Analysis Program (FIA) database (USDA Forest Service, 2011). The data was modeled on an annual basis together with LULC classes that identified both forest types and mechanically disturbed forested land (resulting from forest cutting). Forest thinning was not considered for the region.

## Carbon Storage and Greenhouse-Gas Fluxes of Terrestrial Ecosystems in the Great Plains Region

Climate change, LULC change, land management, and ecosystem disturbances are the primary drivers of the changes in carbon storage and GHG fluxes. Annual LULC maps of the three IPCC-SRES scenarios were merged to form four primary terrestrial ecosystems for the assessment, according to the definitions outlined in Zhu and others (2010). In addition to the LULC data, other key data are needed to model baseline and future projected carbon storage and GHG fluxes, including (1) soil data (for example, texture, bulk density, erodibility, and drainage class by soil layers) from the USDA soil survey databases (USDA Natural Resources Conservation Service, 2006, 2009) processed and mapped for soil organic carbon (SOC) content (Bliss and others, 2009; Sundquist and others, 2009; Waltman and others, 2010), (2) historical climate data from Oregon State University's "parameter-elevation regressions on independent slopes model" (PRISM), and (3) future climate projections from MIROC 3.2-medres. Because of the constraints of the model structure, only the top 20 centimeters (cm) of the soil layer was considered for soil organic carbon data.

The growth curves of coniferous, broadleaf, and mixed forests; forest age; and other forest data (all derived from the USDA's FIA database; Heath and others, 2009; Miles and Smith, 2009; Woudenberg and others, 2010; USDA Forest Service, 2011) were used to initialize the forested land component of the models. The growth curves also were used to calibrate the biomass accumulation rates simulated by the process-based models. The temporal change of forest growth caused by CO<sub>2</sub> fertilization, nutrient availability, and climate change was simulated using the input data described above; however, the temporal change of forest growth due to enhancement from genetics and cultivation was not simulated because of insufficient data. Grain yields from the USDA census data for all major crops (USDA Economic Research Service, 2011b) were used to calibrate the production routines of the process-based models. Temporal (historical and future projected) changes in grain yields for all crops were grouped into six distinct Michaelis-Menten growth curves using USDA historical census data and grain-yield projections from IMAGE 2.2 (Strengers and others, 2004). The lateral movements of soil, carbon, and nutrients; their impacts on the regional carbon balance and GHG fluxes; and their linkage to aquatic ecosystems were not directly addressed in this assessment.



## 12 Baseline and Projected Future Carbon Storage and Greenhouse-Gas Fluxes in the Great Plains Region

Carbon dynamics and GHG fluxes between the land and the atmosphere under the LULC, climate change, and land management scenarios (described previously) were simulated using three ecosystem models in the General Ensemble Biogeochemical Modeling System (GEMS) (Liu and others, 2004, in press; Liu, 2009; Zhu and others, 2010). The three models are the Erosion-Deposition-Carbon Model (EDCM) (Liu and others, 2003), the CENTURY model (Parton and others, 1987), and a spreadsheet model described in the methodology document (Zhu and others, 2010). The process-based models EDCM and CENTURY have been tested widely in various ecosystems worldwide (for example, Parton and others, 1993; Tan and others, 2006, 2007; Liu and others, 2003). The use of the three models helps account for inherent uncertainties related to model structure and parameterizations. Using the above-described datasets for LULC, areas burned by wildland fires, land management, climate, and other biophysical data, the three GEMS-based models were run for each of three IPCC-SRES scenarios (A1B, A2, and B1; Nakicenovic and others, 2000) and for one GCM (MIROC 3.2-medres) for a total of nine model runs for each ecosystem.

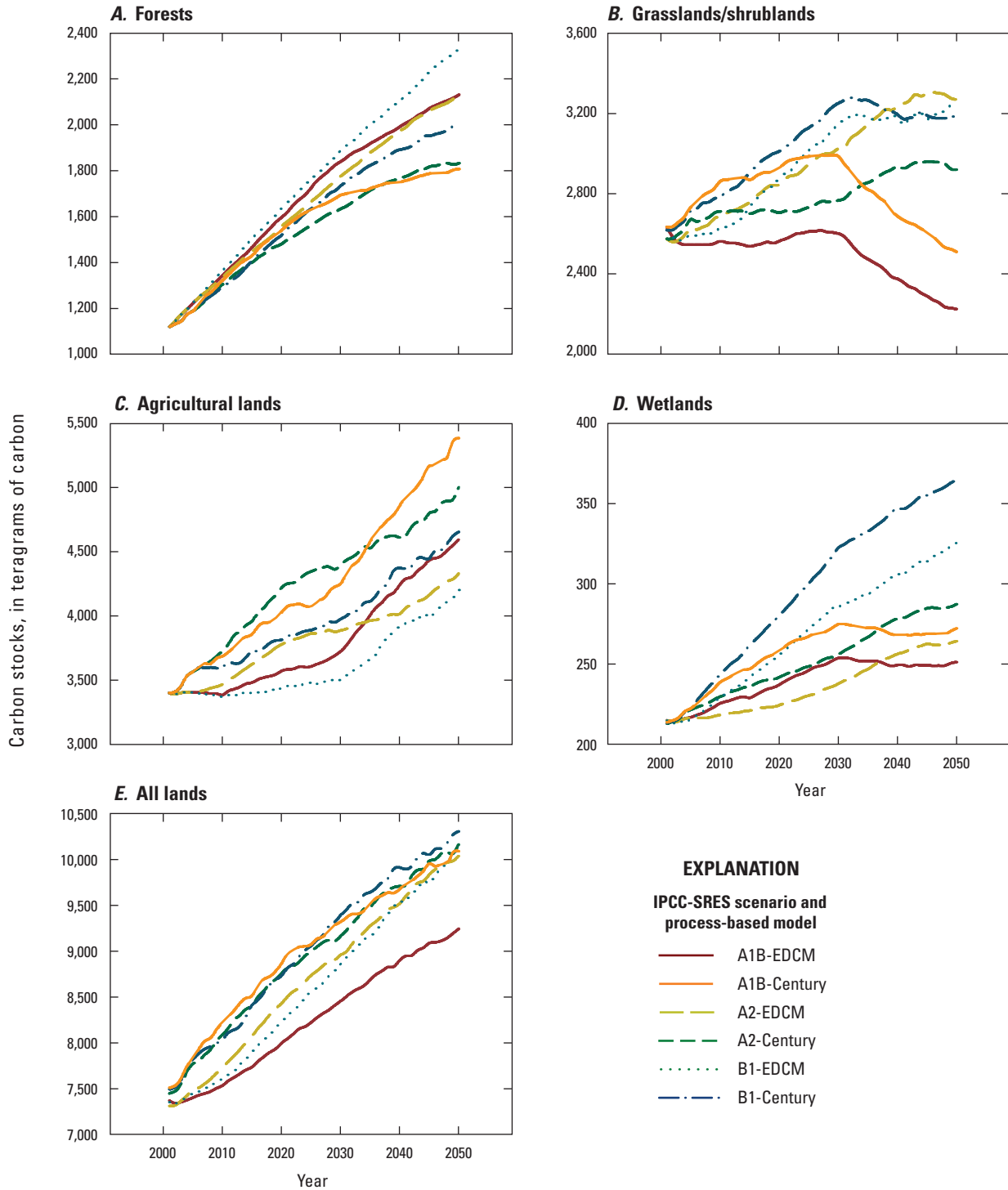
The results for the Great Plains region are shown in figures 4 and 5 and in table 3 below.

The emissions of N<sub>2</sub>O and CH<sub>4</sub> from the region were estimated using a combination of process-based and spreadsheet models. Spatial and temporal changes in CH<sub>4</sub> and N<sub>2</sub>O were estimated using the spreadsheet model with data about LULC, fire, and emission factors derived from the literature (Robertson and others, 2000; Gleason and others, 2009; EPA, 2011a). Baseline emissions (expressed as “CO<sub>2</sub> equivalent,” or CO<sub>2-eq</sub>) were 82 TgCO<sub>2-eq</sub> for CH<sub>4</sub> and 158 TgCO<sub>2-eq</sub> for N<sub>2</sub>O. By 2050, emissions were estimated to range from 80.67 to 93.86 TgCO<sub>2-eq</sub> and from 168.58 to 186.2 TgCO<sub>2-eq</sub>, respectively, for CH<sub>4</sub> and N<sub>2</sub>O, depending on projection scenario. Changes in carbon stocks in ecosystems were simulated by the EDCM and CENTURY models because they were capable of simulating the impacts of various natural processes and disturbances on the carbon cycle. Maps showing the spatial distribution of the total GHG emissions in 2010 in the Great Plains region and graphs showing projected future emissions are presented in figure 6.

**Table 3.** Baseline land area and carbon stock and projected 2050 land area, carbon stock, and annual net flux density, under each of the three IPCC-SRES scenarios for terrestrial ecosystems in the Great Plains region. Mean annual net flux density and total carbon sequestration projections (changes in carbon stocks from mean baseline to 2050) are also given.

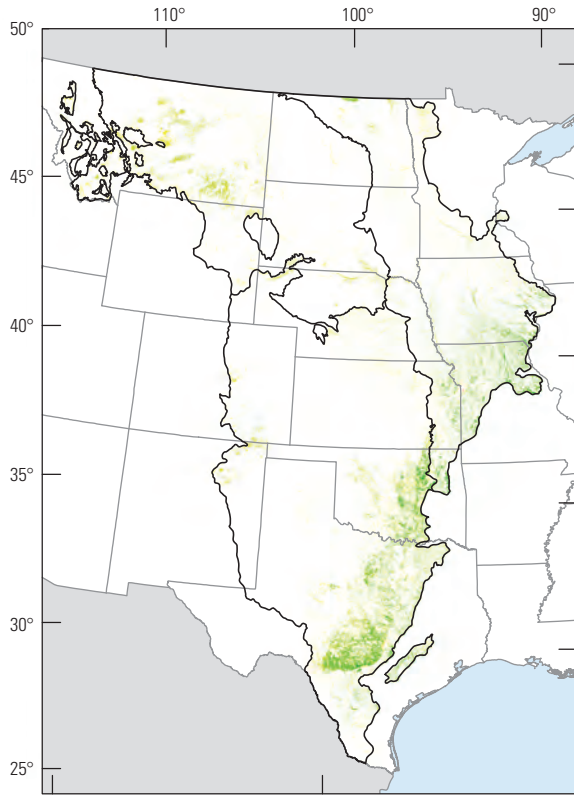
[The area of water bodies is given, but carbon-flux analysis was conducted separately (see discussion in section entitled, “Carbon Fluxes of Aquatic Ecosystems in the Great Plains”). For annual net flux density estimates, negative values indicate sequestration and positive values indicate emission. Figures may not sum to totals because of independent rounding. IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios (Nakicenovic and others, 2000); km<sup>2</sup>, square kilometers; TgC, teragrams of carbon; gC/m<sup>2</sup>/yr, grams of carbon per square meter per year; —, not applicable]

Variables by timeline		Forests	Grasslands/ shrublands	Agricultural lands	Wetlands	Water	Other lands	Total
Baseline	Area (×1,000 km <sup>2</sup> )	116	1,041	920	30	25	38	2,170
	Stock (TgC)	1,162	2,614	3,438	216	—	70	7,500
A1B	2050 area (×1,000 km <sup>2</sup> )	106	840	1,117	28	25	55	2,170
	2050 stock (TgC)	1,968	2,369	4,990	262	—	78	9,665
	Annual net flux density (gC/m <sup>2</sup> /yr)	−191.5	−6.9	−16.2	−51.9	—	10.0	−22.2 (mean)
A2	2050 area (×1,000 km <sup>2</sup> )	106	944	1,011	29	25	55	2,170
	2050 stock (TgC)	1,980	3,094	4,668	276	—	80	10,099
	Annual net flux density (gC/m <sup>2</sup> /yr)	−190.2	−17.0	−19.6	−55.4	—	8.9	−26.6 (mean)
B1	2050 area (×1,000 km <sup>2</sup> )	115	994	948	37	28	47	2,170
	Stock (TgC)	2,163	3,223	4,430	345	—	67	10,228
	Annual net flux density (gC/m <sup>2</sup> /yr)	−193.9	−16.2	−20.8	−48.9	—	9.9	−27.9 (mean)
Mean annual net flux density (gC/m <sup>2</sup> /yr)		−192.5	−13.4	−18.8	−52.1	—	9.6	−25.6 (mean)
Mean baseline to 2050 stock change (TgC)		875	281	1,258	78	—	5	2,497
Standard error (TgC)		85	197	182	19	—	13	145

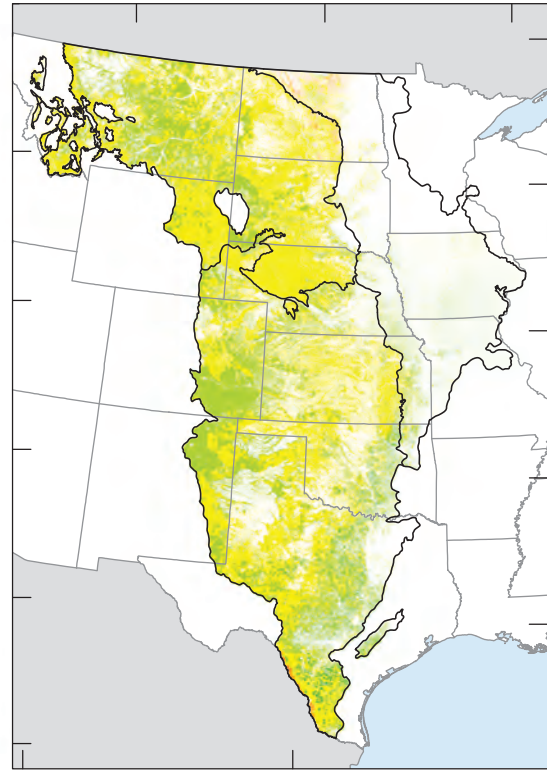


**Figure 4.** Graphs showing the trends of terrestrial carbon stocks over time in the Great Plains region, for the four primary ecosystems and all lands under each of the three IPCC-SRES scenarios (A1B, A2, and B1; Nakicenovic and others, 2000), using two biogeochemical models. *A*, Forests. *B*, Grasslands/shrublands. *C*, Agricultural lands. *D*, Wetlands. *E*, All lands. Note that the scale of the y-axis is different for each graph. EDCM, Erosion-Deposition-Carbon Model; IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios.

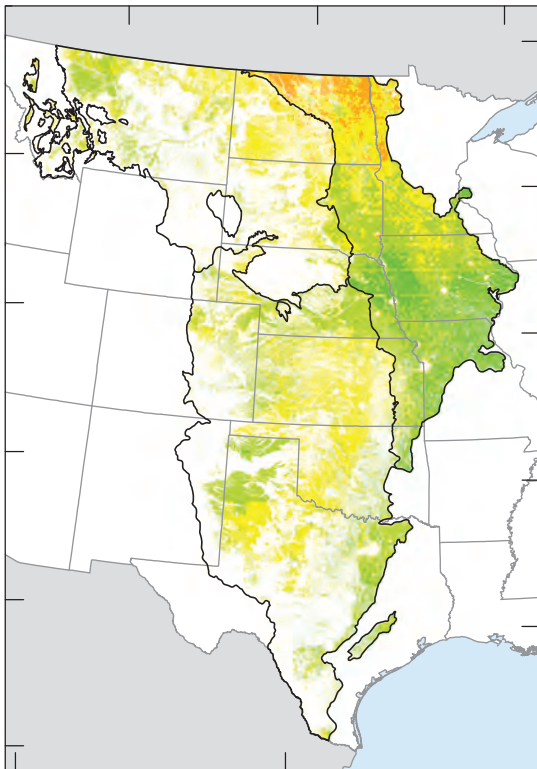
**A. Forests**



**B. Grasslands/shrublands**



**C. Agricultural lands**

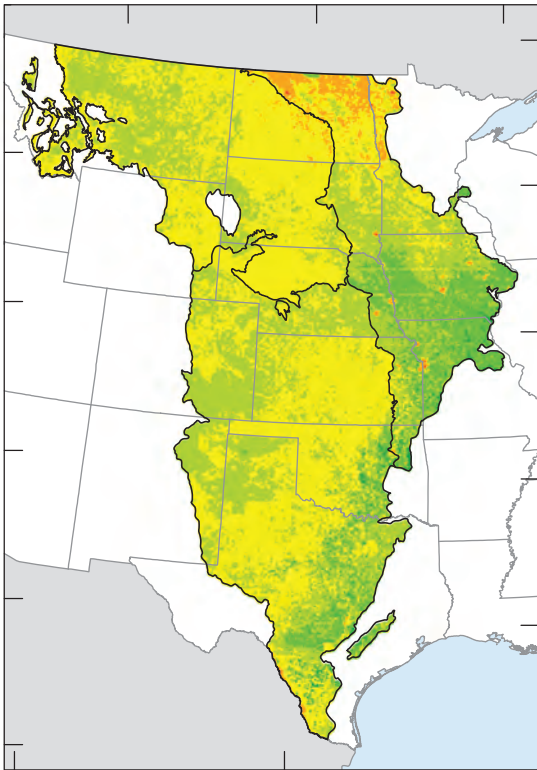


**D. Wetlands**



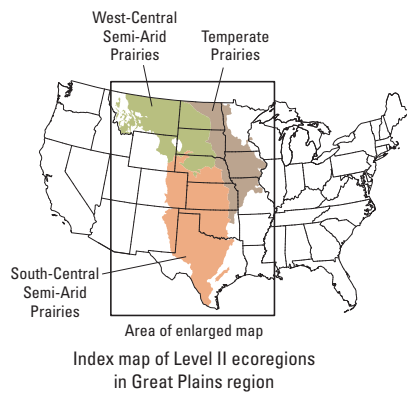
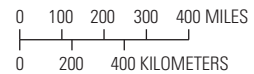
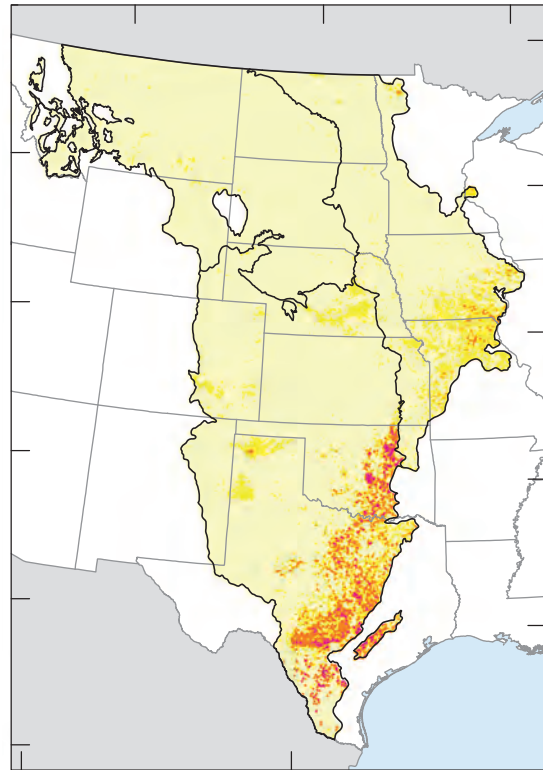


E. All lands



Base from 2001 National Land Cover Database (Homer and others, 2007)

F. Uncertainty



EXPLANATION

Total carbon sequestration, in kilograms of carbon per square meter (A-E)

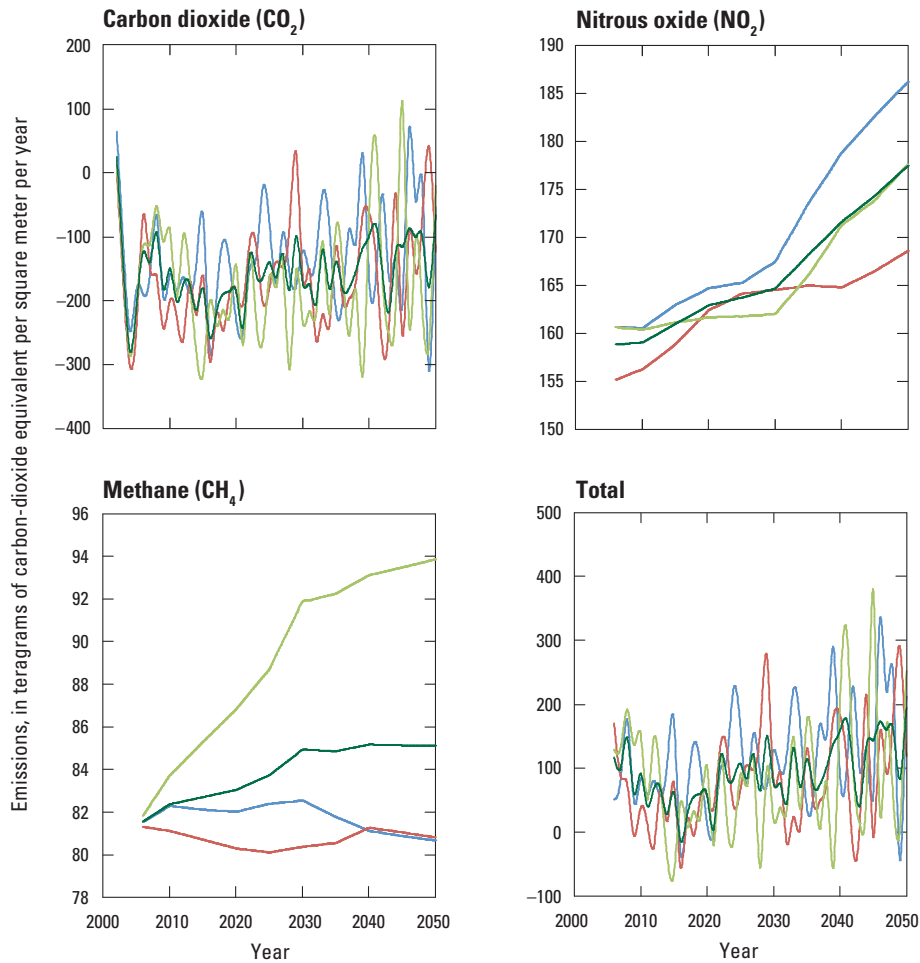


Uncertainty of carbon sequestration, in kilograms of carbon per square meter (F)



— Level II ecoregion boundary

**Figure 5 (pages 14 and 15).** Maps showing the spatial distribution and uncertainty of carbon sequestration (negative) and emission (positive) in the Great Plains region, by ecosystem between the baseline and 2050. A, Forests. B, Grasslands/shrublands. C, Agricultural lands. D, Wetlands. E, All lands. F, Uncertainty. The carbon sequestration value represented on the maps is the mean of a total of six simulations performed by the EDCM and CENTURY models under each of the three IPCC-SRES scenarios (A1B, A1, and B1; Nakicenovic and others 2000). Uncertainty is expressed as the standard error of these simulations. EDCM, Erosion-Deposition-Carbon Model; IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios; <, less than; ≤, less than or equal to; >, greater than; ≥, greater than or equal to.



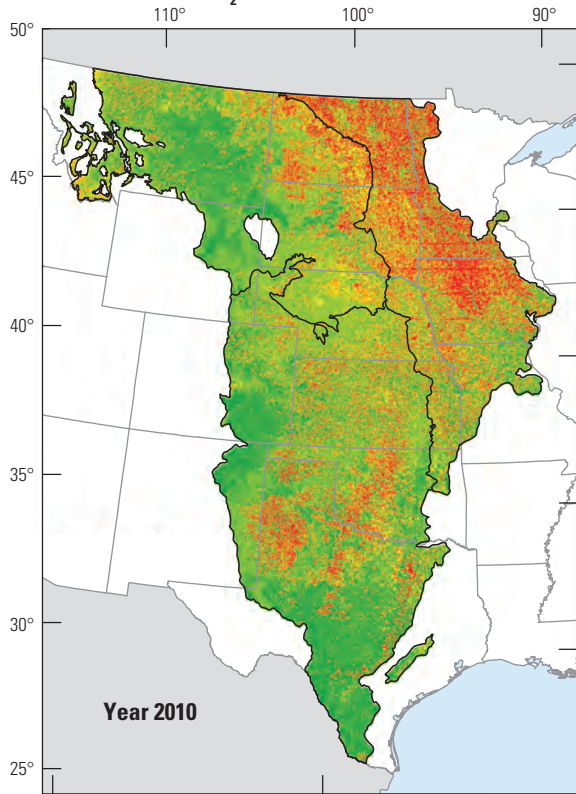
**EXPLANATION**

- (Graphs)**  
**IPCC-SRES scenario**  
 — A1B  
 — A2  
 — B1  
 — Mean

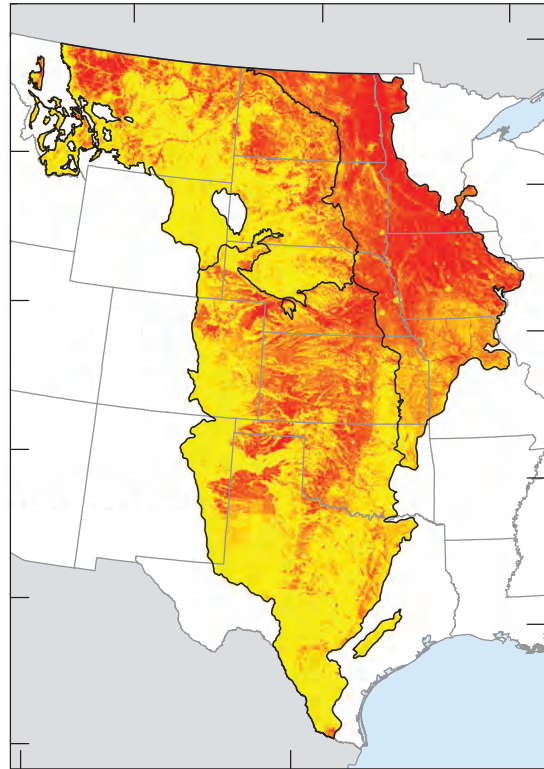
- (Maps)**  
**Emissions in 2010, in grams of carbon-dioxide equivalent per square meter per year**  
 ■ ≤ -250  
 ■ -250 to -50  
 ■ -50 to 50  
 ■ 50 to 250  
 ■ >250  
 — Level II ecoregion boundary

**Figure 6 (pages 16 and 17).** Graphs and maps showing temporal trends of projected future greenhouse-gas emissions and their spatial distribution in 2010 in the Great Plains region. The projected future CO<sub>2</sub> fluxes were estimated using the process-based models EDCM and CENTURY within GEMS; N<sub>2</sub>O, and CH<sub>4</sub> fluxes were estimated using the spreadsheet model. The high variability of CO<sub>2</sub> over time was caused by the impacts of the interannual variability of climate and land-management practices. Because the spreadsheet model does not account for the climate and land-management effects, the temporal changes in N<sub>2</sub>O and CH<sub>4</sub> fluxes only reflect the impact of LULC change. Note that the scale of the y-axis is different for each graph. EDCM, Erosion-Deposition-Carbon Model; GEMS, General Ensemble Modeling System; IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios; LULC, land use and land change; ≤, less than or equal to; >, greater than.

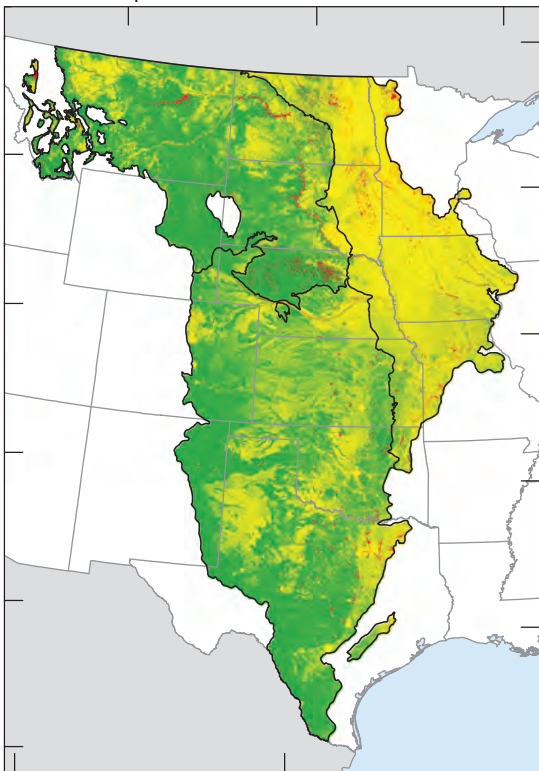
Carbon dioxide (CO<sub>2</sub>)



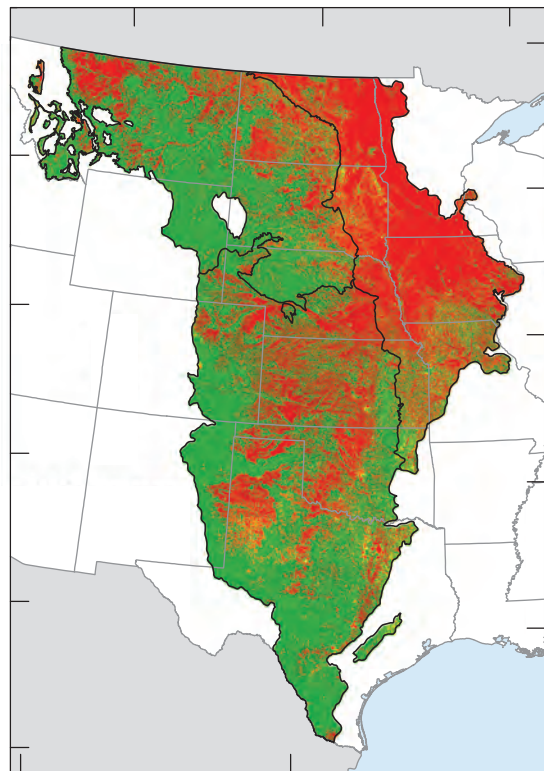
Nitrous oxide (NO<sub>2</sub>)



Methane (CH<sub>4</sub>)



Total



Base from 2001 National Land Cover Database (Homer and others, 2007)

0 100 200 300 400 MILES  
0 200 400 KILOMETERS

## Carbon Fluxes in the Aquatic Ecosystems of the Great Plains Region

Aquatic ecosystems in this regional assessment include streams, rivers, perennial ponds, lakes, and impoundments. For this report, the term “riverine” refers to both rivers and streams and “lacustrine” refers to both lakes and impoundments. For aquatic ecosystems, the baseline estimates were calculated using input data that spanned the recent decades (varying between the 1970s and the present, depending on the type of data) and were produced for two major fluxes: lateral carbon flux in riverine systems and CO<sub>2</sub> evasion (efflux) from both riverine and lacustrine systems. Lateral flux describes the transfer of dissolved and particulate carbon by riverine systems from terrestrial landscapes to inland water bodies, major rivers, and coastal areas. Carbon-dioxide evasion occurs when surface water is supersaturated with CO<sub>2</sub> relative to the atmosphere. Lateral fluxes can be estimated using concentration and streamflow data available from the USGS. For this assessment, a multiple regression approach was used, which estimated daily flux as a function of streamflow, seasonality, and time, and where daily fluxes were totaled and expressed on an annual basis. More details on the methods used for calculation of carbon loads (TgC/yr) in lateral flux can be found in Zhu and others (2010).

In this regional assessment, 59 streamgages provided adequate recent water-quality and discharge data that were used to estimate total organic carbon (TOC) fluxes, and 149 streamgages had enough recent data to estimate dissolved inorganic carbon (DIC) flux. These data were collected on streamgages between 2000 and 2010. On average, rivers in the Great Plains region transferred 0.07 to 0.31 TgC/yr (mean=0.19 TgC/yr) from upland terrestrial systems to inland waters and coastal areas. Annual DIC yield ranged between 1.9 and 2.2 gC/m<sup>2</sup> (mean=2.1 gC/m<sup>2</sup>) whereas the TOC ranged from 0.57 to 0.92 gC/m<sup>2</sup> (mean=0.73 gC/m<sup>2</sup>). These values were within the estimated carbon yields for the Missouri River made by Raymond and Oh (2007), who reported 1.5 to 3.5 gC/m<sup>2</sup>/yr as DIC and 0.2 to 2.0 gC/m<sup>2</sup>/yr as TOC. Inorganic carbon represented about 60 percent of the total lateral carbon flux. A recent study of carbon fluxes to coastal areas in the United States found that the export of inorganic carbon was three times greater than the export of TOC (Edward G. Stets, USGS, unpub. data, 2011). The processes that contribute to riverine inorganic carbon transport include the oxidation of organic matter, the dissolution of carbonate minerals, and the transfer of products from both terrestrial ecosystems and in-stream respiration.

Partial-pressure CO<sub>2</sub> concentrations and CO<sub>2</sub> flux were calculated by stream order within each ecoregion and were based on alkalinity, temperature, and pH measurements from 966 stations made between the 1970s and the present and archived in the USGS’s National Water Information System (NWIS) (Butman and Raymond, 2011). For lacustrine systems, the water-to-air CO<sub>2</sub> efflux was calculated based on the concentration gradient between dissolved CO<sub>2</sub>

and overlying atmospheric concentrations. The regional distribution of dissolved CO<sub>2</sub> was estimated from calculated values for lacustrine systems in the EPA National Lakes Assessment (EPA, 2011b) ( $n=342$ ). The gas transfer velocity ( $k$ ) of CO<sub>2</sub> was calculated for each ecoregion as a function of mean annual wind speed and water temperature. The lacustrine surface areas for each ecoregion were obtained from the USGS’s National Hydrography Dataset (NHD; U.S. Geological Survey, 2011), and ice cover was estimated based on mean monthly skin-surface temperature.

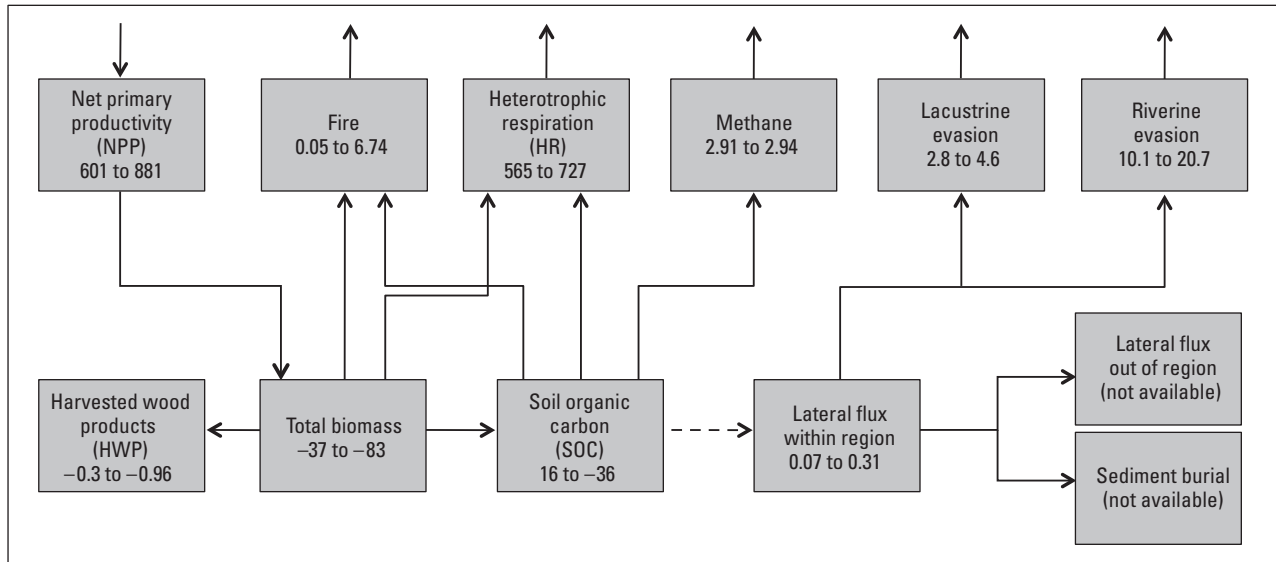
Using the above empirical data and modeling techniques, it was possible to scale up CO<sub>2</sub> evasion estimates to give a total vertical CO<sub>2</sub> flux for the Great Plains region from riverine and lacustrine systems. Although the percent of total surface area of the region that is covered by rivers and streams (0.32 percent) is less than lakes or impoundments (1.26 percent), the estimate of CO<sub>2</sub> evasion from riverine systems was higher (37 to 73 TgCO<sub>2-eq</sub>/yr, mean=55 TgCO<sub>2-eq</sub>/yr) than that from lacustrine systems (10 to 17 TgCO<sub>2-eq</sub>/yr, mean=13 TgCO<sub>2-eq</sub>/yr). The greater rate of CO<sub>2</sub> evasion from riverine systems can be explained by higher transfer velocities and higher dissolved CO<sub>2</sub> concentrations in rivers and streams.

## Integrated Analysis

By integrating carbon estimates of the four major terrestrial ecosystems, emissions of wildland fires, and aquatic fluxes, an overall regional baseline carbon budget was constructed, as shown in figure 7. This figure shows relations between carbon fluxes for all of the ecosystems in the region. The range values indicate minimum and maximum estimates of the baseline years for a given component of the assessment. For biomass and soil organic carbon boxes, the minimum and maximum values are from different years of the baseline. A net ecosystem carbon production is estimated to range from 20 and 99 TgC/yr (mean=65 TgC/yr). As shown in the figure, there is uncertainty concerning (1) overlaps between terrestrial ecosystems and aquatic ecosystems and (2) the effects of wildland fire on carbon stocks. For example, in the figure, the carbon evasion flux (12.8–24.6 TgC) is attributed to the flux from lacustrine and riverine ecosystems; however, some portion of this evasion may already be accounted for in the terrestrially derived heterotrophic respiration (HR) term. Additionally, not all carbon from the lateral flux process is exported from the region. Riverine or lacustrine systems within the region may store terrestrially derived carbon in sediments; carbon sequestration in sediments is unknown at this point as work is ongoing.

The Great Plains region features extensive grasslands/shrublands and agricultural lands. Both of these ecosystems have undergone intense land-use changes because of agricultural practices and urban expansion, which are the primary processes that influence carbon sequestration and GHG fluxes in the Great Plains. Such relations are demonstrated in the results of the assessment.





**Figure 7.** Chart showing the minimum through maximum ranges of net flux values (in teragrams of carbon per year, or TgC/yr) for all of the major components of estimated baseline (current) carbon budget for the Great Plains region. The arrows above the top row of boxes show the directions of the net fluxes in relation to the atmosphere. The bottom boxes show the net fluxes within the region. The negative values in the total biomass and soil organic carbon boxes indicate carbon uptake

or sequestration; positive values indicate carbon emission. The dashed lines indicate uncertainty in delineating boundaries between related components, such as between terrestrial and aquatic fluxes, because the methods are not fully coupled. The heterotrophic respiration values account for both ecosystem respiration and consumption (both grain consumption and grazing by livestock). Both lacustrine and riverine evasion refers to CO<sub>2</sub> evasion, with the value converted to carbon.

The LULC classes (and hence ecosystem areas) exhibited modest changes between 1992 and 2005 (the baseline period for LULC analysis) highlighted by distinctive local increases in developed land (particularly in the southern Great Plains), declines in forest cover, and steady trends in overall agricultural lands and grasslands/shrublands. Socioeconomic factors, particularly the demand for agricultural lands, are the primary drivers of changes in LULC in the region, and this is reflected in both the mapped and projected future LULC that make up the ecosystems for this assessment. Under the A1B scenario, a very high demand for biofuels, including cellulosic biofuel, is projected to drive strong increases in both the cultivated crop (traditional biofuels) and hay/pasture (cellulosic biofuels) agricultural classes over time. Under the A2 scenario, the projected increases in cultivated crops are driven by strong population increases, but the overall projected increases in agricultural land are smaller than under scenario A1B. Under both the A1B and A2 scenarios, the projected increases in agricultural land, as well as significant increases in developed land, result in declines in “natural” land covers (grasslands/shrublands, forests, and wetlands) by 2050. Under the environmentally focused B1 scenario, the projected initial increases in natural land cover are reversed after 2030 as the population increases; there also is a move towards less intense, more environmentally friendly agricultural practices, which result in a projected need for an increase in agricultural land. Under the B1 scenario, the overall natural land cover is projected to decline only slightly between the baseline years and 2050.

Areas burned and resulting emissions in baseline years demonstrate the large interannual variability in fire activity in the region. Among the three Level II ecoregions included in the Great Plains region, annual burned areas and emissions were greatest in the South-Central Semi-Arid Prairies (averaging 1,675 km<sup>2</sup> and 5.83 TgCO<sub>2-eq</sub>) and lowest in the Temperate Prairies (averaging 63 km<sup>2</sup> and 0.41 TgCO<sub>2-eq</sub>). When the baseline results were analyzed for the entire Great Plains region, the observed amount of area that burned varied widely, from as much as 8,159 km<sup>2</sup> in 2006 to as little as 453 km<sup>2</sup> in 2004, which yielded a mean burn rate of 1,713 km<sup>2</sup>/yr. The vast majority of area burned was grasslands/shrublands. Greenhouse-gas emissions from the fires were strongly related to the area burned: the highest was in 2006 at 24.72 TgCO<sub>2-eq</sub> and lowest was in 2004 at 0.18 TgCO<sub>2-eq</sub>, with an average of 5.96 TgCO<sub>2-eq</sub>.

The simulated projected burned areas and emissions from 2011 to 2050 also have a large interannual variability (table 2, fig. 3), which is similar to the observed MTBS data. Under each of the three scenarios (Nakicenovic and others, 2000), there were projected increases in trends in the simulated burned area and emissions, but differences among them were small; however, the increasing trends in the amount of burned area were not significant based on the Mann-Kendall trend test (Mann, 1945) of area burned versus time ( $\tau=0.03, 0.03,$  and  $0.00,$  and  $p\text{-values}=0.15, 0.14,$  and  $0.94,$  for scenarios A1B, A2, and B1, respectively, where  $\tau$  ranges between  $-1.0$  (decreasing trend) and  $1.0$  (increasing trend) and  $p\text{-values}$

indicate the degree to which  $\tau$  is significantly different than 0, or no trend). The projected trends for emissions were slightly different. Under all three scenarios, emissions increased but only by slightly varying amounts when  $\text{CO}_2\text{-eq}$  versus time was analyzed ( $\tau=0.04, 0.05, \text{ and } 0.03$  and  $p\text{-values}=0.0226, 0.0039, \text{ and } 0.0978$ , for scenarios A1B, A2, and B1, respectively). The slightly increasing trends in burned area and emissions are a conservative estimate of the potential change in the Great Plains as the simulations underestimated the influence of extreme fire years; extreme events are expected to increase in occurrence under a warming climate (IPCC, 2007). The effects of fire on carbon sequestration were modeled using both the EDCM and CENTURY process-based models. The findings were similar to those in the recent literature (Ansley and others, 2002); the effects of fire on carbon sequestration (reducing the amount of carbon stored in ecosystems in the region) were small, averaging 0.08, 0.11, 0.12 and 0.12  $\text{TgC/yr}$  for the baseline assessment years (2001–2005) and under the A1B, A2, and B1 scenarios (2006–2050), respectively.

A unique feature of this assessment was the examination of the movement of carbon through aquatic systems. The results for the baseline period showed that, although the total area covered by aquatic ecosystems in the region is small (less than 2 percent of the total land surface), aquatic systems are active sites of carbon transfer and cycling. In addition, these results demonstrate that riverine systems are not closed “pipelines” that transfer carbon from upland ecosystems to coastal areas (Cole and others, 2007). Instead, there is considerable loss of carbon as water and sediments move laterally through the system. Climate conditions are projected to be wetter in the north and drier in the south (Karl and others, 2009), and these projected increases in temperature, evaporation, and drought will have impacts on water resources. Given the strong link between water flow and lateral carbon fluxes (Schlesinger and Melack, 1981; Schindler, 1997; Runkel and others, 2004), in areas where lower precipitation and higher evaporation are projected, lower carbon fluxes may be possible.

Work to develop a region-specific estimate of carbon sequestration in sediments is ongoing; however, the dominance of small, artificial impoundments combined with the high prevalence of agricultural lands in the Great Plains suggests that sediment burial of organic carbon represents a significant carbon sink in this region. Downing and others (2008) measured organic carbon burial rates of between 148 and 17,000  $\text{gC/m}^2\text{/yr}$  in agriculturally eutrophic impoundments in Iowa. If burial rates are similarly high throughout the Great Plains region, sediments could be sequestering at least as much carbon as is lost by means of  $\text{CO}_2$  efflux from aquatic ecosystems.

Estimates of  $\text{CH}_4$  and  $\text{N}_2\text{O}$  emissions were calculated by using the spreadsheet model, which relied on LULC change as the primary data without considering other land-management activities. Emissions of  $\text{CH}_4$  were estimated at an average rate of 82  $\text{TgCO}_2\text{-eq/yr}$  from 2005 to 2010 and increase in future years (81 to 94  $\text{TgCO}_2\text{-eq/yr}$  by 2050, or a  $-1.62$  to 16 percent change) (fig. 6). The  $\text{CH}_4$  emission rate

estimated by this study is higher than the EPA estimates for the entire Nation, which vary from 15 to 27  $\text{TgCO}_2\text{-eq/yr}$  (EPA, 2011a) and for which EPA only considered  $\text{CH}_4$  emissions from forests and rice cultivation but not from other major emitters such as wetlands. Under the B1 scenario, wetland areas in the region are projected to increase and decrease under the A1B and A2 scenarios (fig. 2). The projected trends in  $\text{CH}_4$  emissions reflect those changes in wetland areas (fig. 6); however, it should be noted that the  $\text{CH}_4$  uptake by grasslands/shrublands and agricultural lands was not considered in the assessment. For  $\text{N}_2\text{O}$ , a mean annual emission of approximately 158  $\text{TgCO}_2\text{-eq}$  from 2005 to 2010 was estimated. This estimate is comparable to the EPA estimates (EPA, 2011a), which reported that the national  $\text{N}_2\text{O}$  emissions from agricultural soils and forests varied from 210 to 226  $\text{TgCO}_2\text{-eq/yr}$ . Future  $\text{N}_2\text{O}$  emissions are projected to increase (169 to 186  $\text{TgCO}_2\text{-eq/yr}$  by 2050 or a 6.7 to 11 percent increase) as a function of the increase in agricultural land areas. About 85 percent of the total global warming potential (GWP) of  $\text{CH}_4$  and  $\text{N}_2\text{O}$  may be offset by carbon sequestration in the Great Plains region. Nevertheless, the net GWP would still emit about 100  $\text{TgCO}_2\text{-eq/yr}$  in the region (fig. 6). Greenhouse-gas emissions and their uncertainty (indicated by a wider spread among scenarios) are projected to increase under all three of the IPCC-SRES scenarios. These increases only reflect the changes in LULC (especially wetlands) because  $\text{CH}_4$  and  $\text{N}_2\text{O}$  emissions were estimated by considering only LULC change using the spreadsheet model.

Between 2001 and 2005 (baseline years for the carbon sequestration and GHG flux assessment), grasslands/shrublands covered 48 percent of the Great Plains region but stored 35 percent of the total carbon (table 3). Agricultural lands covered 42 percent of the land area and stored 46 percent of the region’s carbon because of their extensive land area and the relatively high carbon density (3.74  $\text{kgC/m}^2$ ). Forests, wetlands, and other lands cover 5.35, 1.4, and 1.73 percent of the region’s land areas and stored 15.5, 2.9, and 0.93 percent of the total carbon, respectively. Between the carbon uptake by biomass and by soil, the region featured a net ecosystem carbon production rate that ranged from 20 and 99  $\text{TgC/yr}$ , which is approximately 3 to 13 percent of the region’s net primary productivity (NPP). The net ecosystem carbon production rate, when evaluated as  $\text{CO}_2$  equivalents, is approximately 1.16 to 6.58 percent of total GHG emissions of the United States in 2009 (EPA, 2011a). In addition to carbon sequestration, other key processes in the region included heterotrophic respiration (82 to 94 percent of NPP) and aquatic lateral and vertical fluxes (approximately 13 to 26  $\text{TgC/yr}$ ). Following recommendations from Lovett and others (2006) and Chapin and others (2006), the baseline estimate of carbon loss resulting from the effects of grazing was included in the total heterotrophic respiration estimate. The loss of soil organic carbon (SOC) (16  $\text{TgC}$ ) is the result of the severe drought in the region between 2002 and 2003. By comparison, carbon loss resulting from fire emissions was a relatively small portion of the overall carbon budget in the region (fig. 7).

Overall, the assessment projects that the Great Plains region will remain an overall carbon sink, with projected sequestered carbon ranging from 2,165 to 2,728 TgC (mean 2,497 TgC) between the baseline years and 2050, depending on the scenarios (table 3). These projections translate into an annual carbon sequestration of 48.12 to 60.62 TgC (176.5 to 222.3 TgCO<sub>2-eq</sub>), which is about 2.66 to 3.35 percent of total GHG emissions of the U.S. in 2009 (EPA, 2011a); however, the overall strength of sequestration by all major ecosystems is expected to decrease over time (see carbon-dioxide graph in figure 6). Agricultural lands would increase in area but maintain carbon stocks, grasslands/shrublands would lose land area and carbon stocks, and forests would lose land area but gain carbon stocks. On an annual averaged basis, all of the major ecosystems in the region are projected to be carbon sinks, with forests possessing the highest averaged per-area carbon sequestration (192.5 gC/m<sup>2</sup>/yr), followed by wetlands, agricultural lands, and grasslands/shrublands (52.1, 18.8, and 13.4 gC/m<sup>2</sup>/yr, respectively). Over the 50 years between 2001 and 2050, forests would sequester the most carbon per unit of land, followed by wetlands, agricultural land, and grasslands/shrublands.

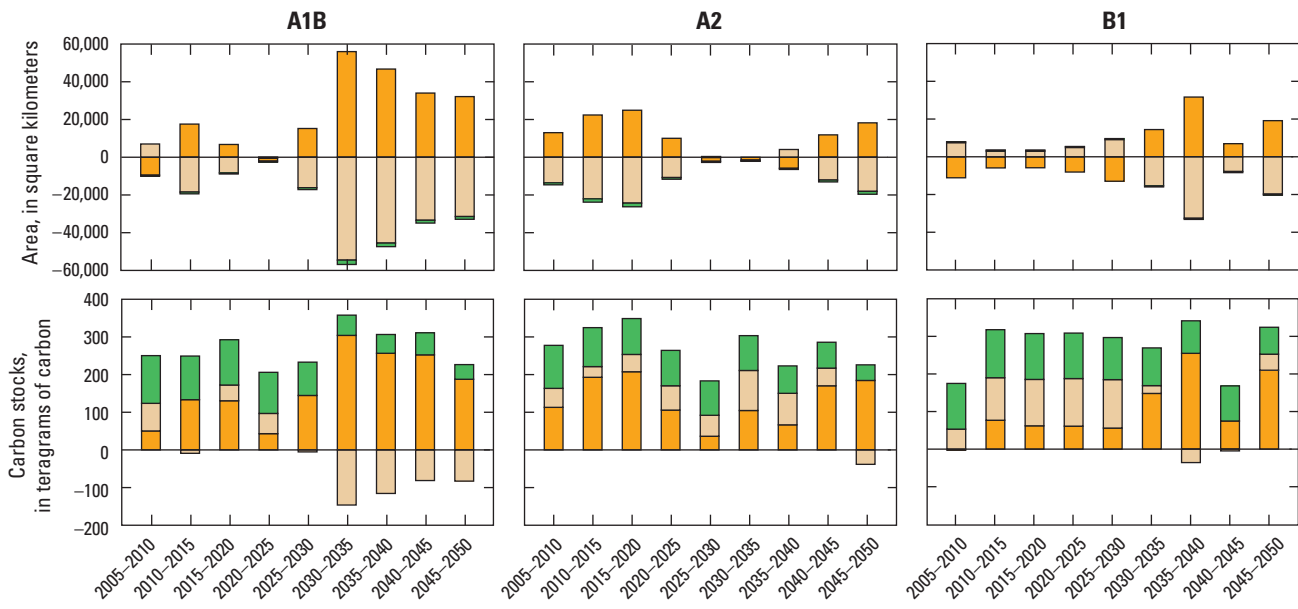
In the Great Plains region, grasslands/shrublands are projected to lose 246 TgC under the A1B scenario or projected to gain 480 and 609 TgC under the A2 and B1 scenarios, respectively, depending on the projected changes in land areas (fig. 2). These projections translate into an annual net flux density ranging from -6.9 to -17 gC/m<sup>2</sup> from 2001 to 2050. The grasslands/shrublands estimates are lower than an estimate by Zhang and others (2011) but higher than the EPA estimate (EPA, 2011a). For the effect of grazing on carbon flux, model runs were initialized based on limited data and assumptions, as described previously. The results show that the effects of grazing on carbon flux in grasslands/shrublands could be considerable. The mean annual carbon removal estimates from grasslands/shrublands (assuming moderate grazing) are approximately 107, 99, 104, and 107 TgC, for the baseline (2001–2005) assessment and under the A1B, A2, and B1 scenarios (2006–2050), respectively. These carbon flux results are lower than the 150 TgC/yr reported by Holechek and others (2000), which was based on USDA livestock inventory data (USDA National Agricultural Statistics Service, 2011).

Using the USDA inventory data, West and others (2010) estimated that the total net ecosystem carbon balance on all agricultural lands in the United States was 7 TgC in 2004. The EPA (2011a) estimated that croplands in the United States acted as a carbon sink, with a storage rate of between 4.75 and 5.37 TgC/yr from 2005 to 2009. Biogeochemical models, however, showed higher estimates than the inventory approach. Using the CENTURY model, Ogle and others (2010) found that croplands in the United States sequestered soil carbon at a rate of 14.6 TgC/yr from 1990 to 1995 and a rate of 17.5 TgC/yr from 1995 to 2000. Nevertheless, this assessment projects an increase in the density of carbon stocks in agricultural lands (from 3.74 kgC/m<sup>2</sup> for the baseline estimate to 4.47 to 4.67 kgC/m<sup>2</sup> by 2050) and an estimated overall mean annual sequestration of 27.95 TgC.

For the baseline years, the carbon storage in forest ecosystems of the Great Plains region was estimated to be 1,162 Tg for a total forested area of 116,196 km<sup>2</sup>, or a carbon stock density of 10.0 kgC/m<sup>2</sup> (table 3). This estimate for total carbon storage is lower than a 2010 USDA Forest Service forest inventory estimate of 2,096 TgC for a forested area of 234,162 km<sup>2</sup>, with a carbon density value of 8.95 kgC/m<sup>2</sup> (Brad Smith, USDA Forest Service, unpub. data, 2010). The difference in total carbon storage was likely caused by the difference between the definitions of forested land used in this assessment and the definition used by the USDA Forest Service; a proportion of land that the Forest Service defined as forested lands was identified as grasslands/shrublands in the NLCD dataset, which was used as the basis for forested lands in this assessment. The comparable carbon density estimates (slightly higher in this assessment compared to the Forest Service estimate) provide further evidence of this analysis. When projected to 2050, the assessment results suggest that forest ecosystems will remain a strong carbon sink, despite the projected loss of forested lands over time, and that the carbon stock density in forested lands increases from an average of 10 kgC/m<sup>2</sup> during the baseline years (2001–2005) to between 18.62 and 18.76 kgC/m<sup>2</sup> by 2050.

Spatially, most carbon sequestration opportunities are projected to occur in the southern and eastern parts of the Great Plains region, where productive soil and favorable climate conditions are found (fig. 5). The assessment also projects the potential for wetland restoration in the Prairie Pothole region of the study area. On the other hand, a projected loss of carbon storage is possible in agricultural lands of the northern prairies as the result of reduced agricultural productivity and increased soil drying. For the entire Great Plains region, all of the major ecosystems except for grasslands/shrublands are projected to increase their storage of carbon through 2050. Grasslands/shrublands are expected to lose carbon toward the second half of the assessment timeline because of the projected loss of land areas of the ecosystem. When these projections are combined, a moderately sized carbon sink is present for most of the timeline, but the strength of the sink is expected to decrease over time, as noted previously.

Carbon storage and stock changes in the region are significantly affected by LULC changes. This assessment indicates that the projected net changes in carbon storage are closely related to the projected net changes in ecosystem areas in the region, but the relationship varies between the three major ecosystems: agricultural land, grasslands/shrublands, and forests (fig. 8). The size and direction of the projected net changes in carbon stored in agricultural lands are directly related to the projected net changes in the size and direction of the agricultural lands. For the grasslands/shrublands and forests, the size and direction of the projected net changes in their land areas have a smaller impact on the size and direction of the projected carbon storage than that of agricultural lands. The projected loss of land areas tended to reduce the projected carbon sequestration but did not tend to change its direction, unless the loss in area became large enough, such as the projected loss of grasslands/shrublands that exists under scenario A1B (fig. 8).



**Figure 8.** Bar charts showing the estimated and projected net changes in the total area and the carbon stocks of the three primary ecosystems in the region (agricultural lands, grasslands/shrublands, and forests) between 2005 and 2050, under the three IPCC-SRES scenarios (A1B, A2, and B1; Nakicenovic and others, 2000). IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios.

**EXPLANATION**

**Ecosystem**

- Agricultural lands
- Grasslands/shrublands
- Forests

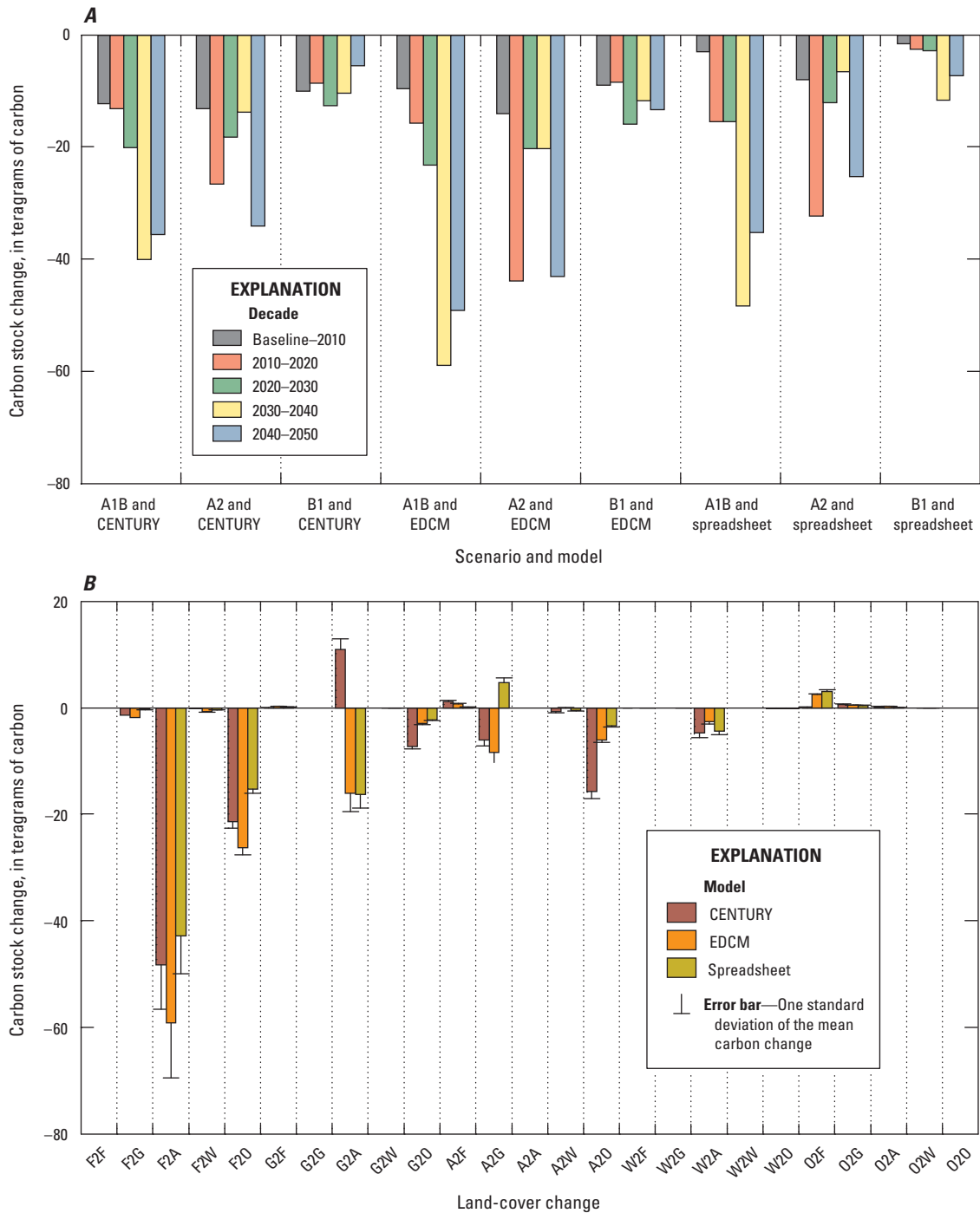
The transitions of land use between the major ecosystems are projected over time as the result of projected LULC changes, as discussed previously and shown in figure 2. These transitions (for example, forests transitioning to agricultural lands) would result in changes in the projected amount of carbon stored in biomass and soils and thus in the projected gains or losses in stored carbon (fig. 9). When considering the effects of land-use transitions alone (without including the effects of land-management activities such as fertilization or grazing in the analysis), the results from all three models (CENTURY, EDCM, and the spreadsheet model in GEMS) for the three IPCC-SRES scenarios suggest overall negative impacts on projected carbon storage in the Great Plains region (fig. 9A), with varying ranges of projected carbon losses between the baseline years and 2050: 59 to 157 TgC using EDCM, 48 to 122 TgC using CENTURY, and 26 to 118 TgC using the spreadsheet model. It should be noted that the spreadsheet model accounted for changes in carbon storage only in vegetation, whereas the CENTURY and EDCM models accounted for changes in all major carbon pools in ecosystems. Among the three IPCC-SRES scenarios, the projected cumulative total loss between the baseline years and 2050 is the largest under the A1B scenario (119 to 157 TgC), followed by A2 (84 to 142 TgC) and B1 (26 to 59 TgC); this order of impact among the scenarios is consistent across all of the models. Given that the mean total carbon sequestration of the Great Plains region is projected to be 2,500 TgC during the study period (table 3), LULC change in the region could potentially reduce the total by about 4 percent.

Among the individual transitions between the major ecosystems, the conversion of forests to agricultural

lands was found to be the dominant factor contributing to the greatest projected negative impact on carbon stocks (fig. 9B). Forest-to-agriculture conversion accounted for half of the carbon loss induced by LULC changes, followed by conversion of forests to other lands (which explains 20 percent of the projected carbon loss). The conversion of grasslands/shrublands to agricultural lands and vice versa had a variable effect on the change in carbon storage, depending on the model that was used (see the bar for G2A versus the bar for A2G in figure 9B); the results indicated that there was structure-related uncertainty in the models. Conversions from wetlands to agricultural lands (W2A), and from forests to grasslands/shrublands (F2G) also lead to a considerable projected loss of carbon stocks. The only consistent projected gains of carbon stocks were from the conversions of grasslands/shrublands to forests (G2F), agricultural lands to forests (A2F), other lands to forest (O2F), and other lands to grasslands/shrublands (O2G); however, these projected gains were much smaller than the projected losses, as shown in figure 9.

Finally, because of time and resource constraints, there are processes and effects that are related to the Great Plains region’s carbon cycle that were not addressed in this report, including: (1) individual effects of modeled land management, (2) modeling of natural vegetation succession, (3) GHG emissions from livestock feedlots, (4) the effects of cover crops on agricultural lands, (5) carbon dynamics in deep soil layers, (6) an estimate of carbon sequestration in aquatic systems such as lakes and impoundments, and (7) a spatially explicit delineation of carbon flux resulting from the lateral movements of soil, carbon, and other materials and its impact on both aquatic and terrestrial ecosystems.





**Figure 9.** Bar chart showing the net impacts of combined LULC changes on carbon stocks in the Great Plains region. *A*, Carbon stocks by decade as estimated using each of the three biogeochemical models (CENTURY, EDCM, and spreadsheet) in GEMS under each of the IPCC-SRES scenarios (A1B, A2, and B1; Nakicenovic and others, 2000). *B*, Changes in carbon stocks resulting from the transition of one land-use type to another between the baseline and 2050, using each of the three biogeochemical models (CENTURY, EDCM, and spreadsheet) in GEMS. On part *B*, for the individual transitions from one land-cover class to another

(x-axis labels), the letters F, G, A, W, and O denote forests, grasslands/shrublands, agricultural lands, wetlands, and other lands, respectively, and the “2” between two letters means “transition to.” For example, F2G refers to “forests transitioning to grasslands/shrublands.” The error bar in part *B* is one standard deviation of the mean carbon change for each of the three IPCC-SRES scenarios. EDCM, Erosion-Deposition-Carbon Model; GEMS, General Ensemble Modeling System; IPCC-SRES, Intergovernmental Panel on Climate Change’s Special Report on Emissions Scenarios; LULC, land use and land change.

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