# Pervasive transition of the Brazilian land-use system

David M. Lapola<sup>1\*</sup>, Luiz A. Martinelli<sup>2</sup>, Carlos A. Peres<sup>3</sup>, Jean P. H. B. Ometto<sup>4</sup>, Manuel E. Ferreira<sup>5</sup>, Carlos A. Nobre<sup>4</sup>, Ana Paula D. Aguiar<sup>4</sup>, Mercedes M. C. Bustamante<sup>6</sup>, Manoel F. Cardoso<sup>4</sup>, Marcos H. Costa<sup>7</sup>, Carlos A. Joly<sup>8</sup>, Christiane C. Leite<sup>7</sup>, Paulo Moutinho<sup>9</sup>, Gilvan Sampaio<sup>4</sup>, Bernardo B. N. Strassburg<sup>10,11</sup> and Ima C. G. Vieira<sup>12</sup>

Agriculture, deforestation, greenhouse gas emissions and local/regional climate change have been closely intertwined in Brazil. Recent studies show that this relationship has been changing since the mid 2000s, with the burgeoning intensification and commoditization of Brazilian agriculture. On one hand, this accrues considerable environmental dividends including a pronounced reduction in deforestation (which is becoming decoupled from agricultural production), resulting in a decrease of ~40% in nationwide greenhouse gas emissions since 2005, and a potential cooling of the climate at the local scale. On the other hand, these changes in the land-use system further reinforce the long-established inequality in land ownership, contributing to rural-urban migration that ultimately fuels haphazard expansion of urban areas. We argue that strong enforcement of sector-oriented policies and solving long-standing land tenure problems, rather than simply waiting for market self-regulation, are key steps to buffer the detrimental effects of agricultural intensification at the forefront of a sustainable pathway for land use in Brazil.

B razil has been unique worldwide in terms of land use. Although vast areas of forests and savannahs have been converted into farmland (Fig. 1) — placing the country as a leading global producer of agricultural commodities — it still safeguards the largest tracts of native tropical vegetation on Earth, with extremely high levels of biodiversity. Patterns of land use change, which until recently exhibited the highest worldwide absolute rates of tropical deforestation, largely resulted in low-productivity cattle pastures<sup>2</sup>. Moreover, climate change issues in Brazil are inextricably related to land use and land-use change (LUC) as approximately 80% of the country's total  $CO_2$ -equivalent ( $CO_2e$ ) emissions in 2005 were sourced from agriculture and LUC<sup>3</sup>.

Demand for farmland is the key immediate driver of LUC in Brazil, and there is little evidence that agricultural expansion is grinding to a halt<sup>4-7</sup>. In fact, Brazil holds the greatest potential for further agricultural expansion in the twenty-first century<sup>8</sup>. Understanding recent LUC patterns (Box 1) and visualizing a sustainable land-use pathway in Brazil have become highly strategic — not only for Brazilians, given that regional and global climate change, food and energy provision, and biodiversity conservation are all at stake.

This Review presents an integrated analysis and provides new insights on recent trends in the Brazilian land-use system. In the first two sections we show how Brazil's agriculture is becoming both gradually decoupled from deforestation processes and increasingly intensified and oriented to large-scale farming of trade commodities throughout the country. Next we explain the economic and political factors driving those changes. The fourth section reveals the drawbacks of those changes in aggravating the long history of inequality in land ownership. We then explore repercussions for climate change, namely for the country's greenhouse gas (GHG) emissions balance, and for the two-way interactions between climate change and land use. Finally, we discuss the meaning of sustainable land use in Brazil, and suggest how we can effectively achieve it in the near future.

#### Decoupling agricultural expansion and deforestation

Although agricultural expansion alone cannot explain the deforestation rates observed in the past<sup>9</sup>, both processes have long been connected in Brazil<sup>10,11</sup>. This became especially evident in the late 1990s, with peaks in cropland area and cattle herd size coinciding with peaks in deforestation in Amazonia and in the Cerrado region (Fig. 2).

Since the mid 2000s, annual deforestation trends began to diverge from fluctuations in cropland area and cattle herd size. Although cropland area and cattle herd continued to increase after 2004, deforestation in all Brazilian biomes plunged to the lowest rates since monitoring began. The decoupling of agricultural expansion and deforestation reported for part of the Amazon<sup>12</sup> and elsewhere in the tropics<sup>13</sup> therefore applies more widely to the whole of Brazil, except for some subregions such as in the northeast Cerrado, where cropland expansion is still tied to native vegetation clearing<sup>14,15</sup>.

Nevertheless, the link between agricultural expansion and deforestation has weakened rather than disappeared completely, as exemplified by the small resurgence in Amazonian deforestation in 2008, that was driven — in a much weaker way than previously seen — by increases in cropland area and cattle herd size.

### Towards a commoditization of the land

From 1990 to 2011 the land area used for cropping in Brazil grew from ~530,000 to ~680,000 km<sup>2</sup>. Large-scale farming of commodity crops (namely soybean, sugarcane and maize) accounted for all

<sup>1</sup>Laboratório de Ciência do Sistema Terrestre, Departamento de Ecologia, Universidade Estadual Paulista, Rio Claro, São Paulo 13506-900, Brazil, <sup>2</sup>Centro de Energia Nuclear na Agricultura, Universidade de São Paulo, Piracicaba, São Paulo 13400-000, Brazil, <sup>3</sup>School of Environmental Sciences, University of East Anglia, Norwich NR4 7TJ, UK, <sup>4</sup>Centro de Ciência do Sistema Terrestre, Instituto Nacional de Pesquisas Espaciais, São José dos Campos, São Paulo 12227-010, Brazil, <sup>5</sup>Instituto de Estudos Sócio-Ambientais, Laboratório de Processamento de Imagens e Geoprocessamento, Universidade Federal de Goiás, Goiânia 74001-970, Brazil <sup>6</sup>Departamento de Ecologia, Universidade de Brasília, Brasília, Distrito Federal 70919-970, Brazil, <sup>7</sup>Departamento de Engenharia Agrícola, Universidade Federal de Viçosa, Viçosa, Minas Gerais 36570-000, Brazil, <sup>8</sup>Departamento de Biologia Vegetal, Universidade Estadual de Campinas, Campinas, São Paulo 13081-970, Brazil, <sup>9</sup>Instituto de Pesquisa Ambiental da Amazônia, Brasília, Distrito Federal 71503-505, Brazil, <sup>10</sup>International Institute for Sustainability, Rio de Janeiro 22460-320, Brazil, <sup>11</sup>Departamento de Geografia, Pontifícia Universidade Católica do Rio de Janeiro, Rio de Janeiro 22451-900, Brazil, <sup>12</sup>Museu Paraense Emílio Goeldi, Belém, Pará 66040-170, Brazil.\*e-mail: dmlapola@rc.unesp.br

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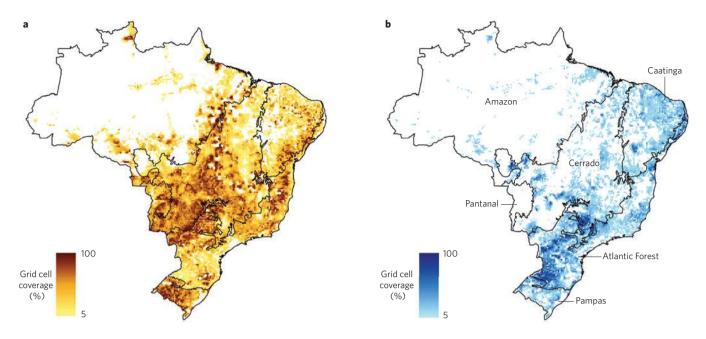


Figure 1 | Spatial distribution of agriculture in Brazilian biomes in 2000. a, Pastures. b, Croplands. Data from ref. 88. Grid cell size is 5 x 5 arcmin.

of that increase (Fig. 2b). By 1990, the area occupied by these monocultures represented 53% of all cultivated area, and 21 years later this proportion increased to 70%. Large-scale commodity farming represented 83% (2011 US\$84 billion) of the country's gross crop production value in 2011<sup>16</sup>. Contrastingly, although representing less than 20% of the gross value of crop production and occupying only 24% of the country's farmland, smallholder agriculture is responsible for a large fraction of the production of staple foods in Brazil<sup>17</sup>. The area cultivated with traditional staple crops such as rice, beans and cassava has contracted by ~30,000 km<sup>2</sup> (-25%). That shrinking, however, has been largely compensated by production intensification<sup>18</sup>. In fact all Brazilian crops, and cattle ranching in particular, were subject to a pronounced intensification, well above world averages<sup>1,6,10,16,19</sup> (Supplementary Fig. 1). Although still inefficient in many regions (mean cattle density ≈1 head per hectare), the stocking density of Brazilian pastures increased ~45% during the 1990–2011 period<sup>2,18</sup> (Fig. 2c). Increased exports of beef and soybean by 720% and 530%, respectively<sup>1,20</sup>, and the high share of genetically modified crops in the agricultural matrix (Fig. 2b) are other strong indicators that Brazilian agriculture is turning to an export-oriented large-scale commodity farming pathway.

Intensification of cattle ranching has been widely shown to be the central pivot of the land-use transition to more environmentally friendly agriculture in Brazil<sup>5,6,21-24</sup>, resulting in land being spared for other uses. This option has to be carefully evaluated, however, given that — in light of land rent theory<sup>13,25</sup> — agricultural intensification and its increased economic attractiveness leads to expansion, rather than contraction of cultivated and grazing land<sup>21,26-28</sup>. So far Brazil is experiencing the opposite effect, with cattle ranching intensification leading to a reduction, or at least no expansion of total pasture area, along with (governance-driven) declining deforestation rates.

## Economic and political conjunctures

Increases in both domestic and international demand for beef, feed and renewable energy, induced by greater purchase power achieved in Brazil in the past ~15 years coupled with market liberalization in Russia and China<sup>5,10</sup>, have created new agricultural market opportunities that Brazil and other countries have taken advantage of. However, some factors specific to Brazil made it feasible to intensify agriculture without increasing deforestation.

A convergence of conditions such as internal market regulations, creation of more protected areas, command-andcontrol crack-down on illegal deforestation and credit barriers imposed by the federal government on municipal counties in deforestation frontiers were largely responsible for the decoupling of deforestation and agricultural expansion in the Amazon<sup>12,29-32</sup>. As a consequence of increased enforceable restrictions on illegal deforestation, it is reasonable to assume that land will become a scarce resource in frontier areas<sup>21</sup>, such as in southern Amazonia, which may lead to a positive feedback for agricultural intensification in those regions, a process now observed in highly consolidated agricultural areas of southern Brazil<sup>26,33</sup>. In such consolidated rural areas, strong intensification of cattle ranching and steps taken by the sugarcane agro-industry to comply with European market requirements<sup>34</sup>, for instance, have been pushing agriculture to set new environmental standards (for example, prevention of illegal deforestation) in large-scale commodity farming.

One of the strongest factors driving the above changes in Brazilian agriculture was the political power exerted by the large-scale agribusiness sector at the National Congress, and often at the state and municipal levels, mainly in the Amazon, Cerrado and Caatinga regions. The rural caucus is the largest elected 'interest group' in the Brazilian Congress at present, having historically held 20–50% of the voting power in the Congress lower house since the onset of the redemocratization process in late 1980s<sup>35,36</sup>. These legislators have, for instance, strongly opposed land redistribution and agrarian reform policies but also influenced the growth of rural credit availability from US\$15 billion in 1990 to US\$75 billion in 2009 (2009 US\$)<sup>37</sup>. That countrywide credit boost allowed heavy investments on agrochemicals for soil improvement in the Cerrado and Amazonian farmland, and the genetic development of cultivars adapted to tropical climates<sup>22</sup>, for example

It is undisputable that such subsidies to the Brazilian agro-industry contributed to the economic surge in Brazil, as this sector has accounted for 25% of the country's gross domestic product (GDP) over the past two decades. However, it is worth questioning what societal sectors have benefited from this commoditization process, as Brazil continues to exhibit — along with a few other countries — the worst inequalities anywhere on Earth in terms of income and land ownership distribution<sup>38,39</sup>.

## Box 1 | LUC context within major Brazilian biomes.

Over 80% of the expansion in cropland in Brazil from 1990 to 2011 occurred in the Amazon and Cerrado regions<sup>18</sup>. Amazonia and northern portions of the Cerrado are also the only regions where pasture area has increased (at the expense of native vegetation) over the past 20 years<sup>18,91</sup>. Nevertheless, pasture area evolution over that period for the entire country is debatable, with Brazil's official data accounting for a ~13% reduction (1.78 to 1.53 million km<sup>2</sup>)<sup>18</sup>, whereas Food and Agriculture Organization (FAO) statistics indicate a ~6% increase (1.84 to 1.96 million km<sup>2</sup>) restricted to the 1990s<sup>1</sup> (Fig. 2c).

Amazon Region. Since the early 1990s, Brazilian Amazonia entered a renewed phase of colonization and land use, in which tax incentives played a lesser role and profits from logging and largescale agriculture and cattle ranching, as well as low land prices, drove much of the frontier expansion<sup>94</sup>. This process has been supported by government and bilateral investment programs in infrastructure, such as transport facilities and energy provision7. Despite this pressure, there has been a prominent decline in overall deforestation since 2005: from an annual average of ~18,000 km<sup>2</sup> in the 1990-2004 period to ~10,500 km<sup>2</sup> in 2005-2012, with the lowest rate ever of 4,571 km<sup>2</sup> in 2012 (Fig. 2a) (drivers of this declining deforestation are addressed in the 'Economic and political junctures' section). Pastures for beef production remain the dominant land use, occupying 60% to 80% of deforested land<sup>92</sup> (Fig. 1), with regional cattle numbers reaching more than 50 million<sup>18</sup> heads since 2004.

Cerrado Region. Agriculture now occupies nearly 1 million km<sup>2</sup> of the Cerrado, or ~50% of the biome's original extent<sup>18,88</sup>. Cattle ranching is also by far the dominant land use, but a fraction of these pastures has been replaced recently by advancing large-scale mechanized cropping of soybean and sugarcane, for example<sup>18,19,95</sup>. In fact the Cerrado is Brazil's most important beef producing region, hosting the largest extent of pasturelands and ~50% of the national herd (Fig. 1a). The pronounced conversion of the Cerrado into soybean monoculture over the past two decades was one of the main contributors to the expansion in total cropland area in Brazil (Fig. 2b). However, as in the Amazon, annual deforestation rates are falling from a mean of ~16,000 km<sup>2</sup> in early 2000s to ~6,500 km<sup>2</sup> in 2010 (Fig. 2a). Yet the high suitability of the Cerrado topography and soils for mechanized agriculture, the reduced number and total extent of protected areas<sup>81</sup> (Fig. 3b), the lack of a well-established and routinized deforestation surveillance program, and potential leakage pressure resulting from declining deforestation in Amazonia all indicate that the Cerrado will continue to be a principal region of LUC in Brazil<sup>14,29,53</sup>.

Atlantic Forest Region. The Atlantic Forest biome, an extremely threatened biodiversity hotspot, hosts most of Brazil's croplands

## Collateral effects on land distribution

Land distribution is a long-term chronic problem in Brazil. The 2006 national census revealed that nearly 75% of all agricultural land area (2.3 million km<sup>2</sup>) is in the hands of large-scale commodity-oriented farmers, who own only 10% of all farm land titles in the country. Conversely, the remaining 25% of farmland is occupied by smallholders, who represent 90% of all Brazilian rural properties (Fig. 4).

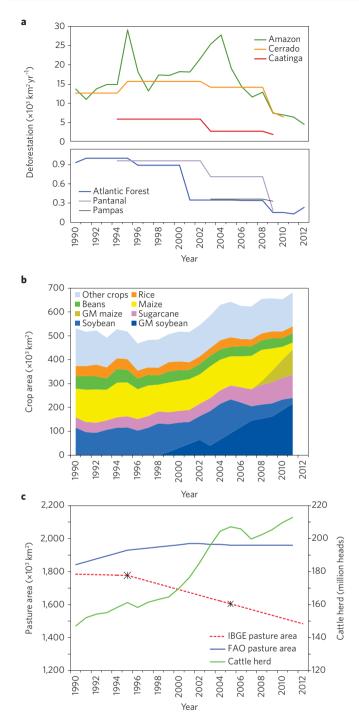
Despite the eventual environmental and socioeconomic gains achieved during the past decade with the technological improvements and policy regulations of Brazil's agricultural sector<sup>40</sup>, the above changes in the land-use system reinforced the historical

(Fig. 1b), and is inhabited by ~125 million people, including several major metropolitan areas such as São Paulo and Rio de Janeiro. Only 12% (~160,000 km<sup>2</sup>) of the original vegetation remains, less than 50% of which is located in protected areas<sup>89,91</sup>. However, the area of secondary forest has been increasing in some regions, as predicted by forest transition theory for consolidated agricultural frontiers<sup>33</sup>, owing to the widespread transition to mechanized agriculture (which does not operate in steep areas), and to market-driven enforcement of environmental laws (for example, the Forest Code bill). Dominant land uses in the region are large-scale sugarcane farming and cattle ranching<sup>19,88</sup> with relatively high cattle stocking rates (~2 head per hectare) spread throughout the biome's southwest region<sup>2</sup>. In the state of São Paulo alone, sugarcane cropland increased from ~18,000 km<sup>2</sup> in 1990 to ~52,000 km<sup>2</sup> in 2011<sup>18</sup>. Although most of this recent sugarcane expansion is occurring in previous pasture lands<sup>19,44,95</sup>, it can be argued that the livestock demand once met by these pastures has been at least partly relocated to the Amazon and Cerrado regions (where pastures have expanded at expense of native vegetation)<sup>21,44,96</sup>, even though methods to objectively detect these indirect LUC have yet to be developed97.

Caatinga Region. The semi-arid polygon of northeast Brazil known as Caatinga comprises 970,000 km<sup>2</sup> of predominantly thorn-scrub vegetation. From a total human population of ~21 million, 44% live in the rural areas, relying heavily on smallholder and seasonal agriculture, goat husbandry (the dominant land use along with subsistence cropping) and firewood harvesting (the major driver of deforestation in the region)98. Recent irrigation projects have prioritized export-oriented fruit production. However, major impacts due to poor land management, timber extraction, poorly planned irrigation projects and increasing frequency of severe droughts are contributing to the expansion of desertification, with degraded areas accounting for 40,000 km<sup>2</sup>, leading to consequent loss of biodiversity, carbon stocks and soil structural and chemical properties<sup>99</sup>. Available estimates indicate that annual deforestation occurred at rates of ~5,900 km<sup>2</sup> yr<sup>-1</sup> over the 1994-2002 period, decreasing after that to ~1,900 km<sup>2</sup> in 200915 (Fig. 2a).

**Pantanal Region.** Despite being the most intact biome in Brazil (only 15% of its original extension has been converted to anthropogenic uses, mostly for cattle ranching)<sup>91</sup>, forestry, the construction of hydroelectric dams and navigation are building pressure for LUC in the seasonally flooded Pantanal region. Nevertheless, the region has also experienced a decline in deforestation over the past decade<sup>15</sup> (Fig. 2a). Marked environmental concerns over the runaway expansion of sugarcane plantations in neighbouring biomes motivated a legal ban prohibiting sugarcane monoculture in the Pantanal (and Amazonia)<sup>100</sup>.

inequality in land ownership. In the 1986–2006 period there was an increase both in the number of large farms and the total area they occupied. The area occupied by farms larger than 1000 ha increased 1.6% in this period, representing an extra ~170,000 km<sup>2</sup> of largeholdings, namely in the Cerrado and Amazonian agricultural frontiers. Moreover, there has been a decrease in the number of small farms and the total area occupied by small-scale farming, particularly in the Caatinga, probably owing to the hardship faced by smallholders in competing with large-scale commodity farming<sup>41</sup> and voluntary changes in lifestyle. Some consequences of these changes in land distribution are discussed below.



**Figure 2 | Trends in land-use change and agricultural expansion in Brazil during the 1990-2012 period. a**, Deforestation rates in all Brazilian biomes<sup>3,15,89,90</sup>. Remaining native primary vegetation area in each biome: Amazon: 80%; Cerrado: 51%; Caatinga: 54%; Atlantic Forest: 12%; Pantanal: 85%; Pampa: 46%<sup>89,91,92</sup>. **b**, Area under each crop type<sup>18</sup>. GM, genetically modified. **c**, Total pasture area and cattle herd size<sup>1,18</sup>; asterisks represent the values provided by Brazil's official census data and the red dashed line indicates the trends between these values.

**Food security.** Despite the steady shrinkage in overall cropland area allocated to staples such as rice and beans (Fig. 2b), food crop production has increased owing to yield gains (Supplementary Fig. 1), which dismisses scaremongering in projections of food scarcity. However, there could be potential effects on the physical access to food. Although the 4.7% reduction in

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the number of smallholdings (Fig. 4a) involved an arable area of only ~12,000 km<sup>2</sup>, this included over 470,000 individual landholdings. It can therefore be argued that the livelihoods of at least 470,000 households have probably changed with this transition, especially in terms of their financial and physical access to safe food. Nevertheless, increases in per capita income (mainly in the Caatinga owing to short-term welfare policies)<sup>40,42</sup> suggests that access to food may not have been affected, pending more indepth research.

Rural migration and urbanization. Brazil has become highly urbanized in the past decades, with only 15% of the entire population now living in rural areas (Supplementary Table 1) as a consequence of both rural exodus driven by capital input into Brazilian agriculture and escalating urban job supply<sup>43</sup>. In fact, this creates a positive feedback in which smaller rural populations lead to lower reliance on human labour in farming<sup>22,44,45</sup>. This is particularly favourable to large-scale mechanized farming, but aggravates the burgeoning population pressure of Brazilian urban areas<sup>46</sup>, which have grown by approximately 400,000 km<sup>2</sup> (+135%) in the 1992-2010 period (Supplementary Table 1). Urban (instead of rural) population growth was strongly associated with tropical deforestation in the early 2000s<sup>47</sup>. Heavily commoditized regions, such as the sugarcane belt in the state of São Paulo, have up to 98% of the population living in urban areas<sup>18</sup>. Such unplanned urban growth has caused severe environmental and public health problems<sup>48</sup>. This is especially alarming considering that over 11 million Brazilians live in slums with even worse sanitation conditions, and that these people are amongst the most vulnerable to climate change in Brazil<sup>49</sup>.

### Interactions with climate change

While on the one hand land use in Brazil has been reported to be subject and susceptible to global climate change, on the other hand it is also a driver of climatic changes at the local and regional scales. In this section we explore these two-way interactions between land use and climate in Brazil, as well as related changes in GHG emissions.

**Coping with the effects of global climate change.** Agriculture in Brazil is frequently exposed to the effects of climate extremes. For instance, the 2005 drought in western Amazonia impacted agricultural production and food security<sup>50</sup>; the 2010 floods in southern Brazil destroyed one-seventh of the rice production in the state of Rio Grande do Sul; and climatic adversities in 2010–2011 influenced a sugarcane shortfall that forced the sector to make large imports of ethanol to meet overall demand. Both large-scale farmers and smallholders are vulnerable to these extremes in Brazil today, although the impacts on livelihoods are only undisputable for smallholders<sup>51,52</sup>.

For the future, the government's outlook on agricultural growth singles out global climate change as a large source of uncertainty that will steer the magnitude of production growth in the next decades<sup>4</sup>. Some studies on the impact of future climate change on the yields of crops that are widely cultivated in Brazil consistently point out substantial losses in productivity if no adaptation measures are taken (especially for soybean crops)<sup>53,54-57</sup>. The exception is sugarcane, the productivity of which is projected to increase throughout the country. However, fewer studies<sup>53,56</sup> attempted to quantify how these yield changes could influence land use. In fact, the results of these studies were more relevant to elucidating cause-effect relationships within the Brazilian land system, rather than predicting future land-use patterns. The geography of Brazilian agriculture under future scenarios of climate change therefore remains largely undetermined, given uncertainties regarding the CO<sub>2</sub> fertilization effect on crop yields<sup>58</sup>, highly-variable projections of rainfall<sup>59</sup> and the evolution of both prices and

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# **REVIEW ARTICLE**

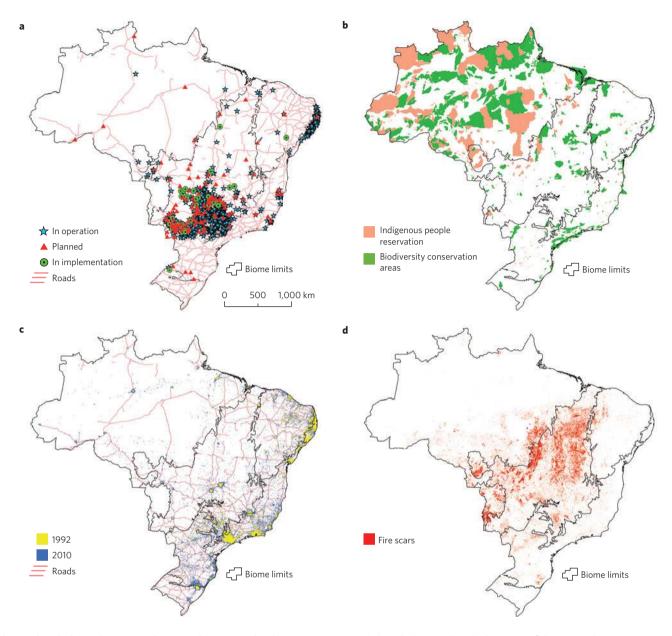


Figure 3 | Biofuels, roads, protected areas and fire in Brazilian biomes. a, Bioenergy (ethanol) plants and road infrastructure<sup>5</sup>. b, Protected areas. c, Urban areas in 1992 and 2010 (as detected from nightlight glow)<sup>93</sup>. d, Fire spots detected in the period 2002-2012<sup>75</sup>. The scale bar in **a** applies to all panels.

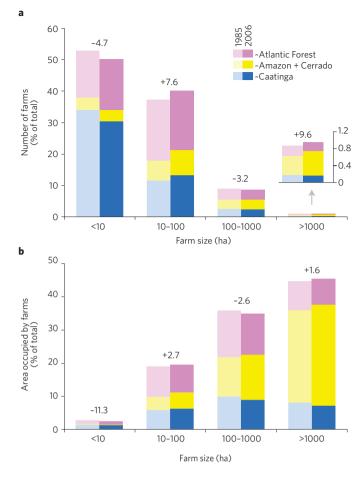
investments in agricultural adaptation to climate change. As a first-order estimate, 2011 US\$480–570 million should be invested yearly until 2050 to adapt Brazilian agriculture to the ravages of climate change<sup>56</sup>. In light of that, smallholder and subsistence farmers, who are far less economically and institutionally supported than commodity farmers, will certainly be heavily impacted by climate change<sup>51,52</sup>.

Effects on local and regional climate. Continuing changes in the Brazilian land-use system may also imply alterations in the local and regional climate. Although past studies revealed a local and regional warming originating from forest and savannah conversion into pastures<sup>60-62</sup>, now the encroachment of pastures by commodity crops leads to divergent biosphere–atmosphere relationships. In the Cerrado biome, for example, changes in albedo and evapotranspiration cause an average regional warming of ~1.6 °C driven by the replacement of the natural vegetation by cropland or pasture, and a cooling of ~0.9 °C when those pastures are converted to sugarcane fields<sup>63,64</sup>. Conversely, modelling studies suggest that the large-scale

substitution of Amazonian pastures by soybean fields will lead to local warming and reduced precipitation compared with pastures. This is due to the marked increase in albedo caused by a decrease in leaf area index, which consequently reduces evapotranspiration in soybean fields between growing seasons<sup>65,66</sup>. However, the net effect is likely to be a cooling of surface temperatures, considering maize cultivation in the soybean off-season, a prevalent double-cropping system in most Brazilian soybean farms.

Although it is still uncertain whether these changes in land surface properties will lead to regional climatic change, there are indications that they will result in important local and seasonal effects<sup>64</sup>. And importantly, the reduction in deforestation and concomitant maintenance of regional forest–atmosphere heat and moisture fluxes gradually moves the country away from the worst regional climate changes projected from large-scale substitution of Amazonian forests and Cerrado savannahs by pastures and croplands<sup>60,65–67</sup> or from degradation of the Caatinga vegetation<sup>68</sup>.

Despite the countrywide reduction in deforestation in the past decade, the number of fire spots detected yearly over the same



**Figure 4 | Evolution of agrarian structure in Brazil between 1985 and 2006.** Numbers above the bars denote the percentage change for each period<sup>18</sup>. -Atlantic Forest: South+Southeast macro-regions (includes Pampa biome); -Amazon+Cerrado: Centre-West+North (includes Pantanal biome); -Caatinga: Northeast (see Supplementary Fig. 2).

period seems to remain largely unchanged<sup>69</sup>. Fires are an important source of aerosols to the atmosphere<sup>70</sup> that affect the net radiant energy reaching the Earth's surface, interfere in the size of cloud condensation nuclei and rainfall intensity with unintended consequences for the hydrological cycle<sup>71</sup>, and ultimately reverberate back to land use itself.

Moreover, there are also local/regional impacts on other components of the climate system. Compared with pastures, commodity cultivation may lead to soil loss through erosion and requires more pesticide and fertilizer use<sup>22</sup>, which can have a potentially severe impact on freshwater systems (as found in sugarcane areas<sup>19</sup>, but this is still uncertain for Amazonian soybean farms<sup>72</sup>) and may also increase GHG emissions released directly by agricultural activities.

**Changes in GHG emissions.** The last official communication from Brazil to the United Nations Framework Convention on Climate Change reported that the LUC sector emitted ~1200 Tg CO<sub>2</sub>e in 2005, representing ~20% of the global LUC CO<sub>2</sub> emissions in that year<sup>73</sup> and ~60% of the total Brazilian emissions (Fig. 5a). Most of these LUC emissions were concentrated in the Amazon and Cerrado regions<sup>74</sup>, where most fire hotspots have usually been detected<sup>75</sup> (Fig. 3d). Preliminary estimates published by Brazil's Ministry of Science, Technology and Innovation (MCTI)<sup>76</sup> for 2010 reveal a strong shift in the country's emission matrix. With the pronounced countrywide reduction in deforestation, LUC emissions in 2010

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were in the order of 280 Tg  $CO_2e$ , representing only ~20% of all  $CO_2e$  emissions in the country (Fig. 5b). That reduction in the LUC sector resulted in a decrease of ~40% in the total Brazilian emissions from 2005 to 2010 (and a reduction of ~10% from 1990 to 2010).

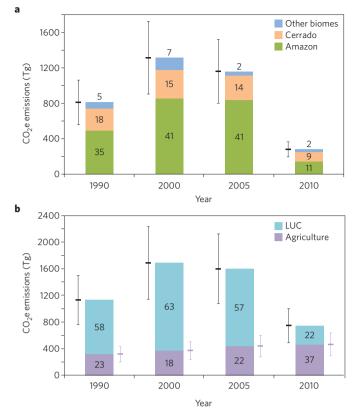
Emissions from agriculture (including those from limestone application in soils and from energy use for agricultural transport) increased by 45% from 1990 (320 Tg CO<sub>2</sub>e) to 2010 (466 Tg CO<sub>2</sub>e). Therefore, agriculture has now replaced the LUC sector for the first time as the leading GHG emitter in Brazil, representing 37% of all Brazilian emissions (Fig. 5b). Even in a hypothetical, but plausible case in which agricultural emissions are considered to be at the lower estimated limit and LUC emissions at the upper limit, emissions from agriculture would be at least equivalent to those from the LUC sector originate from cattle ranching (CH<sub>4</sub> from enteric fermentation and N<sub>2</sub>O from manure decomposition) and to a smaller extent from fertilizer use<sup>3</sup>. In fact, the livestock ranching sector holds a huge potential for mitigating GHG emissions in Brazil<sup>77</sup>.

## Shifting to a new land-use paradigm?

Long-term projections show that food production worldwide is required to increase from 60% (ref. 8) to 110% (ref. 78) before 2050 to ensure global food security. Brazil is expected to contribute a large fraction of that increased production, given its potential for yield improvements and its large arable land availability<sup>8</sup>. Brazil is one of the few countries on Earth with a reasonable chance to both preserve its biodiversity hotspots and wilderness regions (and even effectively use them in a sustainable way) and operate as an agricultural powerhouse, benefiting from its critical export revenues<sup>22</sup>. If successful, this would inaugurate a new land-use paradigm for tropical countries that are heavily dependent on agriculture, but also safeguard a considerable fraction of the world's biodiversity in intact forests and savannahs. It is therefore crucial that such prospective LUC should be guided by solid sustainability principles, given that climate change, food and energy security, and biodiversity conservation are all at stake. But how could such future land-use be sustainably conducted, and what does sustainable land use mean in the case of Brazil?

Reliance on technological improvements and management practices for agricultural intensification is clearly part of the answer. However, to avoid the side-effects of land-use intensification on environmental degradation, the sector should adopt a toolkit of land management approaches that can convert usual agro-ecosystems into more complex balanced land-use mosaics that resemble natural ecosystems in terms of the services they can provide79. These techniques - win-win solutions to avoid soil erosion, build up soil carbon, reduce environmental externalities and ultimately increase productivity - include but are not restricted to: no till, the use of cover crops, elimination of agricultural fires, restoration of vast areas of degraded pastures77 and the adoption of integrated crop-livestock-forestry systems. These options have all been long-proposed and comprehensively tested in Brazilian experimental farms<sup>80</sup> but not yet extensively adopted by the country's farmers.

On the other hand, how do we avoid the lure of agricultural intensification and commoditization, which can drive further pressure on cropland expansion<sup>81</sup> and displace less capitalized smallholders? The changes seen in the past decade (for instance in Amazonia) reveal that strong governance and sector-oriented policies are a *sine qua non* condition to prevent that, rather than simply waiting for market self-regulation. In this context, it is extremely important that the Forest Code — a law that regulates the minimum fraction of native vegetation that is set aside within rural properties — and other policies such as the Low-Carbon Agriculture Program are rigorously enforced<sup>81,82</sup>. Although deforestation rates have decreased considerably, the



**Figure 5 | Greenhouse gas emissions associated with land use in Brazil**<sup>3,76</sup>. **a**, Emissions from land-use change (deforestation) in Brazilian biomes. **b**, Emissions from agriculture (enteric fermentation, manure decomposition, fertilizer use and other sources) and LUC (deforestation). Numbers inside the bars denote percentage share relative to nationwide total CO<sub>2</sub>e emissions (all sectors) in a given year. Error bars represent estimated uncertainty intervals<sup>3</sup> for the LUC sector (**a**), with the agricultural sector indicated in purple and agriculture plus LUC shown in black (**b**). Agriculture includes emissions from the application of limestone to topsoils and from energy use for agriculture-related transport. The 100-year global warming potential method was used for conversion of CH<sub>4</sub> and N<sub>2</sub>O to CO<sub>2</sub>e, where 1 CO<sub>2</sub>e = 21 CH<sub>4</sub> = 310 N<sub>2</sub>O.

area of native vegetation in Amazonia and the Cerrado region converted annually into agropastoral land-use is still significant (~12,000 km<sup>2</sup> yr<sup>-1</sup>), and eliminating this residual deforestation solely with the measures employed so far will be a much bigger challenge. Ambitious multi-sectorial integrated governance measures will be needed for that end. An initial movement in this direction is provided by several complementary mechanisms that enable payments for ecosystem services (including REDD+) implemented or under discussion both at the federal and state level, despite several caveats<sup>83-85</sup>.

It has been repeatedly demonstrated that economic development is more effectively achieved by countries with inclusive economic and political institutions<sup>86</sup>. Inclusive economic institutions are those that provide, among other things, safe property rights for all<sup>87</sup>. In Brazil, almost 40% of smallholders have no land titles, and most of them are located in the Amazon<sup>22</sup>. Property rights for larger farmers are also insecure, mainly owing to perennial conflicts with social minorities such as the landless peasantry or indigenous peoples. Solving long standing problems of land tenure (in both rural and urban areas) is also a milestone on the road to rational land use in Brazil, despite the resistance of successive federal governments to properly address this issue.

In summary, our suggestions for a pathway to sustainable land

use in Brazil are: (1) sustainability-oriented land management practices should be widely implemented throughout Brazilian farms; (2) policies furthering this goal should be encouraged and enforced; (3) the Brazilian Forest Code and complementary mechanisms should be strongly enforced, as a way of guaranteeing ecologically equilibrated landscapes that can combine agricultural production and settlements with conservation of natural resources; and (4) long-existing land tenure problems should be solved to bring about property rights security.

We recognize that all of these suggestions are much easier to discuss than implement, given the complexities of institutional and political systems<sup>9</sup>. It is thus critical to understand for the sake of future generations that land use and its economic revenues can become compatible with social welfare and environmental stewardship in Brazil<sup>83</sup> and other tropical countries. Political institutions and societal organizations in general should be deeply rooted in that mode of thinking, given that sustainable land use in Brazil today means a strong and inextricable combination of technological/management advancements and governance as a way of ensuring that undesirable collateral effects are minimized.

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#### Author Contributions

D.M.L., L.A.M., C.A.P., J.P.H.B.O., M.E.F. and C.A.N. designed the research. All authors contributed to the writing.

#### Additional information

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#### **Competing financial interests**

The authors declare no competing financial interests.