

# Linking land-use change to economic drivers and the biophysical limits of agricultural expansion in the Cerrado

THE WOODS HOLE RESEARCH CENTER

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#### Overview

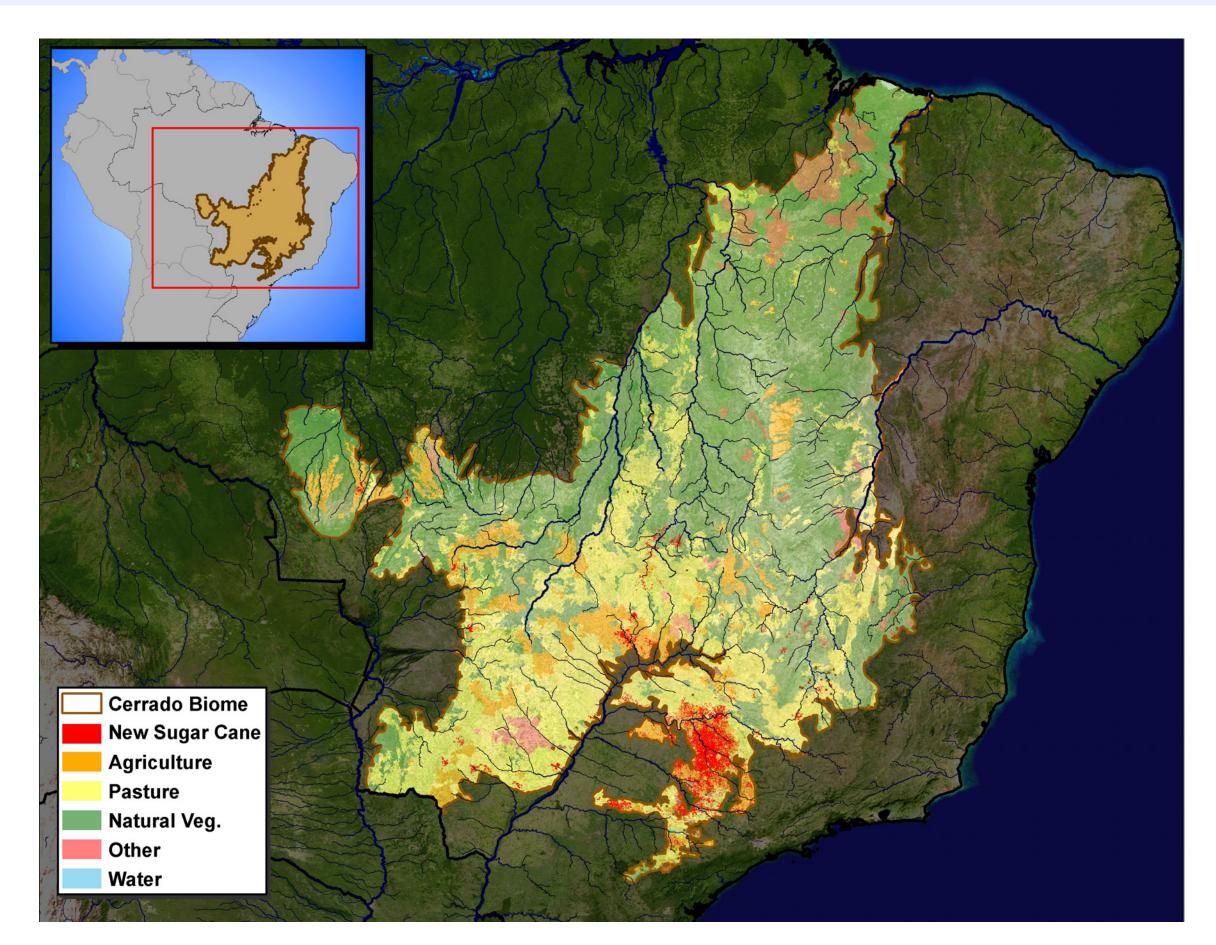


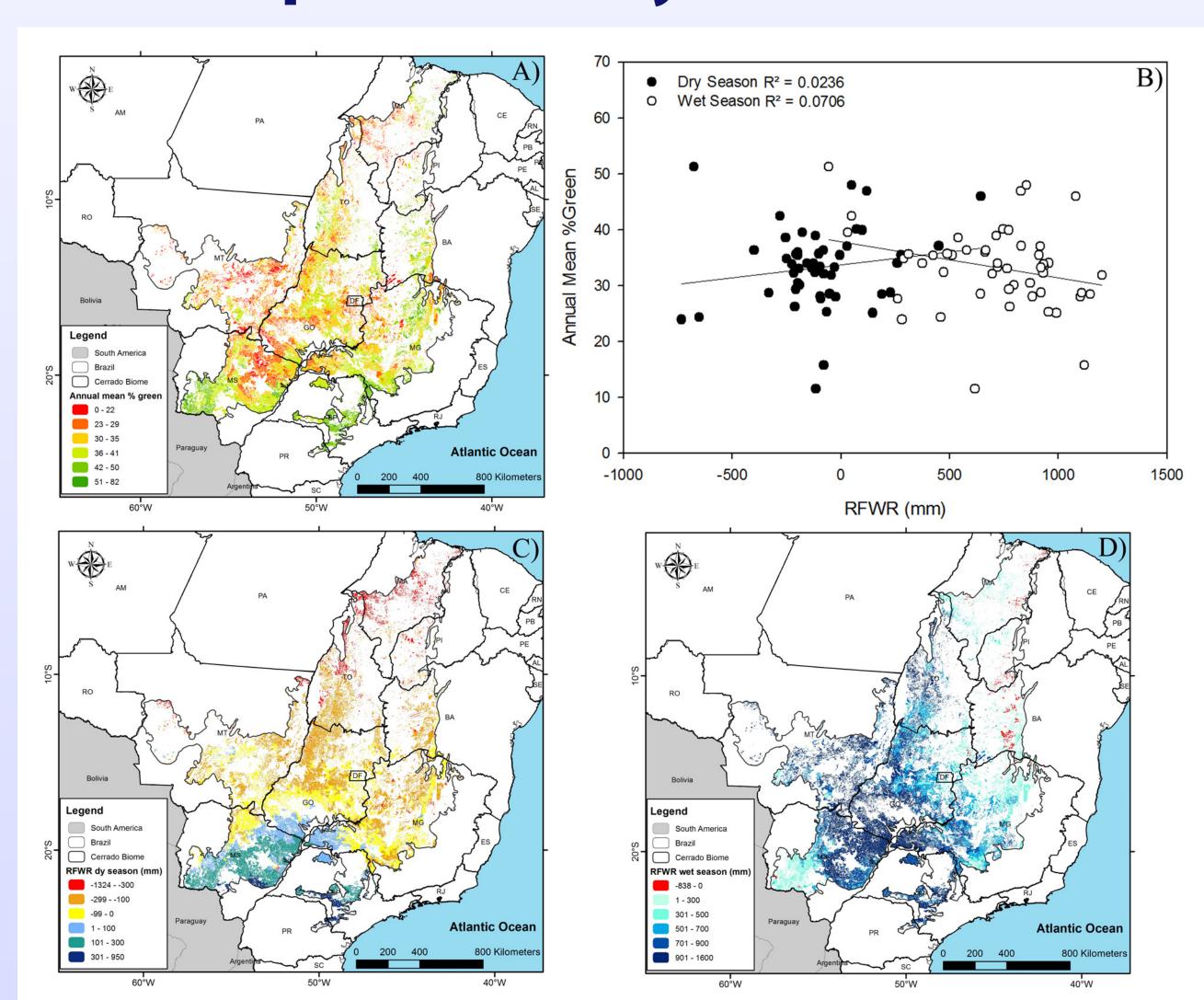
Figure 1. The Cerrado region of Brazil with agricultural lands (orange), pasture (yellow), native savanna vegetation (green), and sugarcane (red). Map produced by Paul Lefebvre (WHRC).

The Brazilian Cerrado is the second largest biome of tropical South America (Figure 1), spanning 2 million km<sup>2</sup>. This savanna ecosystem is a biodiversity hotspot, encompasses the headwaters of several major watersheds, and stores globally significant carbon stocks. While national and international conservation efforts were focused on curbing Amazon deforestation, high deforestation rates in the Cerrado converted 50% of the biome into cattle pastures and croplands. As global demand for commodity crops grows, more efficient use of degraded (low-productivity) pastures has been suggested as a solution for avoiding further deforestation – thus minimizing environmental degradation, while increasing agricultural productivity. This project aims to quantify the extent of degraded pasturelands and their potential to mitigate future deforestation and associated environmental impacts.

# Objectives

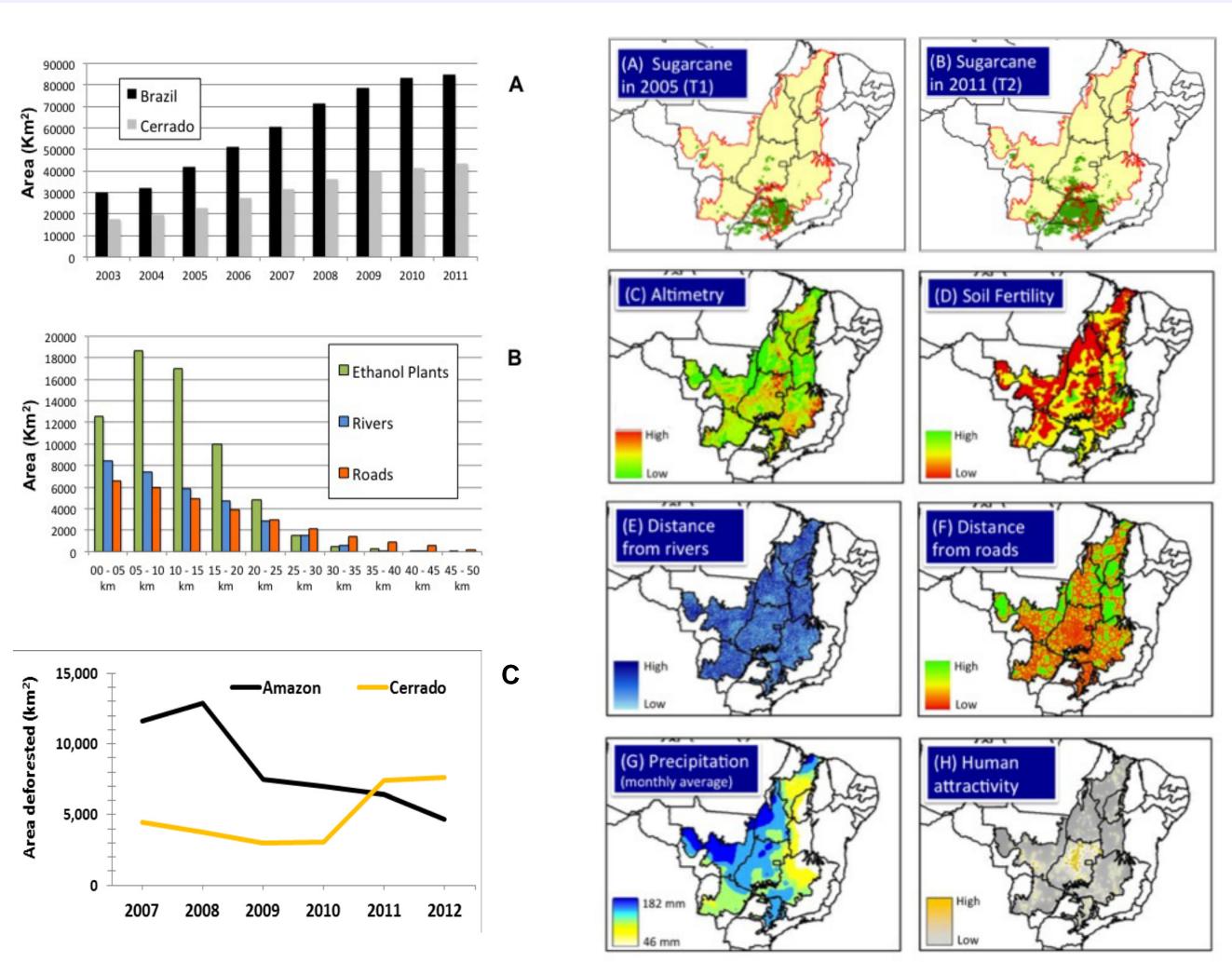
- 1) Quantify the area of low productivity pastures, using multiple resolution satellite sensors.
- 2) Assess the potential impacts of sugarcane expansion on future land-use changes in the Cerrado.
- 3) Appraise inter-regional shifts in agricultural production and their potential impact on deforestation in the Cerrado.
- 4) Estimate historical and potential future changes in carbon stocks and greenhouse gas emissions from agricultural conversion.
- 5) Assess the **hydrological impacts** of historical and future scenarios of deforestation and conversion to intensive agriculture.

### Pasture productivity



**Figure 2.** Annual mean greenness values for 2009-2010 (A); relationship between dry- and wet-season RFWR (renewable freshwater resources) and annual mean % green cover (B); and accumulated available water for dry (C) and wet (D) seasons. Soil fertility and the degree of pasture degradation, common in the Cerrado, are more important predictors of pasture greenness than water deficit (RFWR). Figure adapted from Ferreira et al. (2013).

### Sugarcane expansion



**Figure 3.** Sugarcane area (km<sup>2</sup>) in Brazil and the Cerrado biome from 2003 to 2011 (A); sugarcane area as a function of distance to ethanol plants, rivers and roads (B); deforestation in the Cerrado and Amazon biomes from 2007 to 2012 (C).

Figure 4. Main geographic layers to be used for modeling future scenarios of sugarcane in the Cerrado biome. These data were compiled and standardized for the entire study region and preliminary tests of the model are being conducted for Minas Gerais state.

# Agricultural suitability & policy

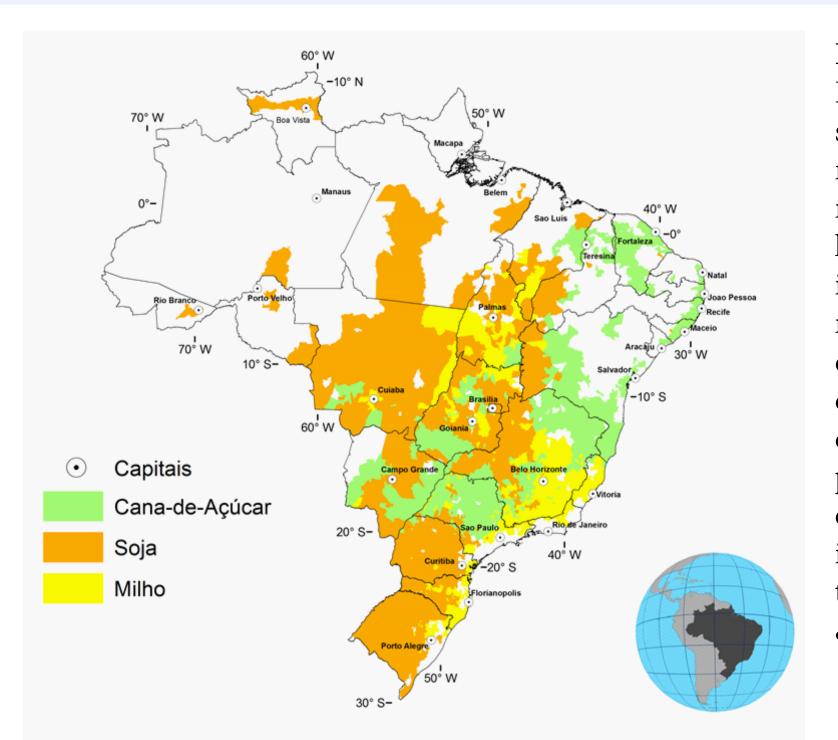
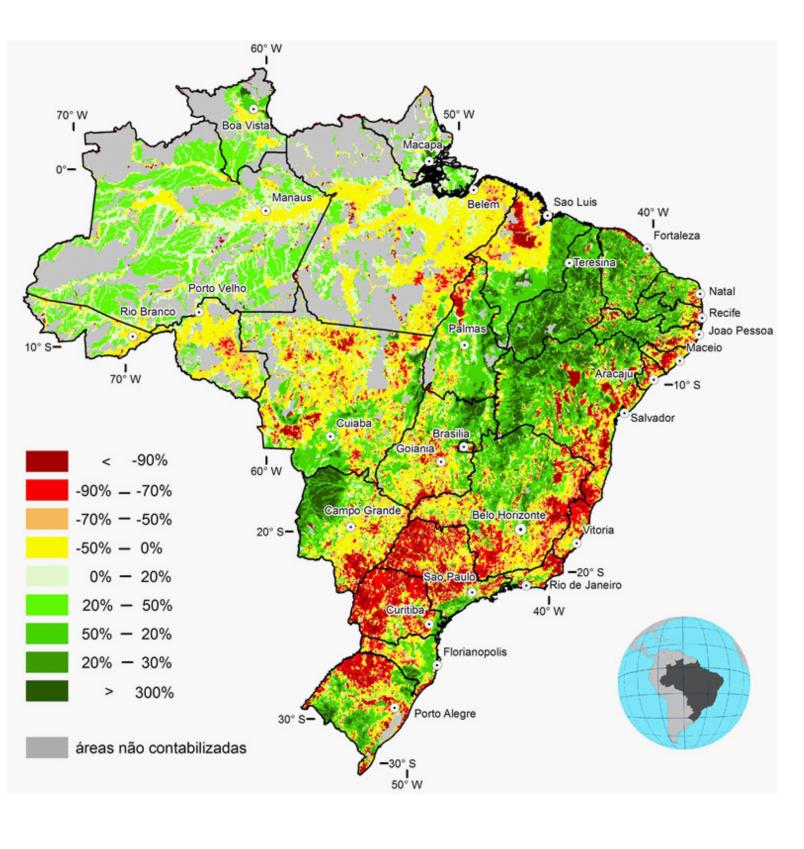


Figure 7: Highest potential rent crop in Brazil, considering a competition between sugarcane, soybeans, and corn. Although much of the Cerrado is dominated by native and planted pastures, the region is highly suitable for soybeans. This suitability modeling is complicated by the fact that many regions with intensive soybean production are moving towards doublecropping -- with soybeans as the primary crop, followed by a fast-growing corn crop planted after the soy harvest. The location of sugarcane production is limited by proximity to ethanol processing plants and transportation infrastructure. Figures 7 and 8 produced by Soares-Filho et al. (UFMG).



tural conversion under the rules specified by the newly revised Brazilian Forest Code (FC). Data are presented per microwatershed, the smallest management unit recognized by the Brazilian National Water Agency (ANA). Percentages represent the amount of deforestation allowed (positive) or reforestation required (negative) to be in compliance with the new FC. We calculate that reforestation (where required) could become the largest Clean Development Mechanism (CDM) project in the world, with the potential to sequester up to 21 billion tons of CO<sup>2</sup>. On the other hand, if all legal deforestation in the Cerrado were to go forward, much of the biome's remaining native vegetation would be lost -- with a tremendous impact on biodiversity, carbon cycling, and the water balance.

Figure 8: Availability of land for agricul-

#### Cerrado deforestation

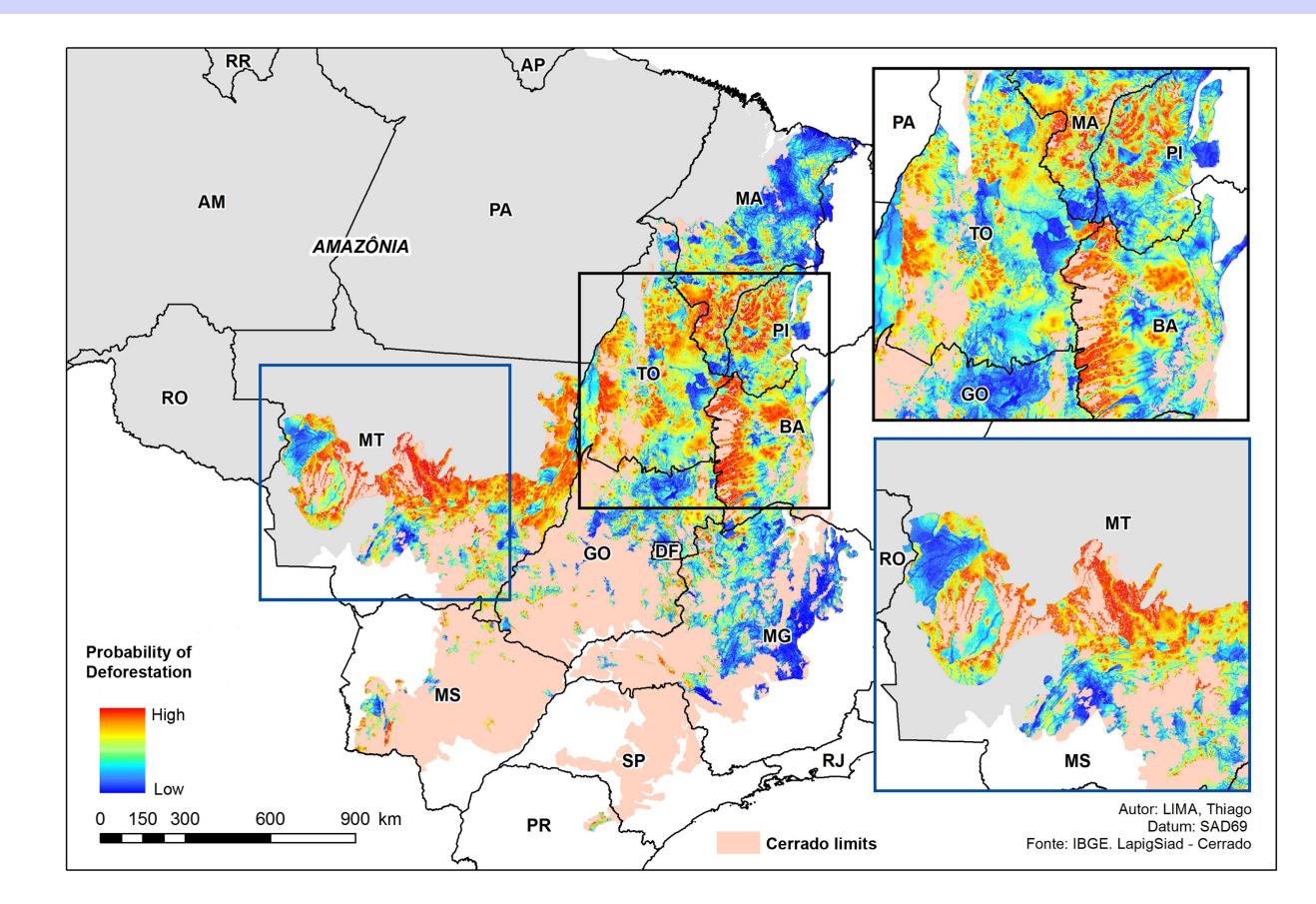
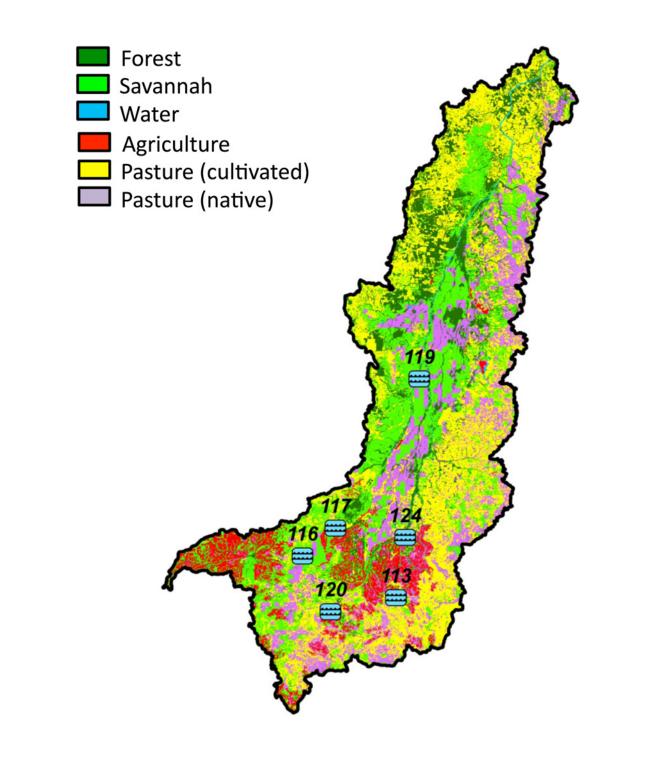


Figure 5. Probability of deforestation from 2000 to 2009, based on a weights-of-evidence econometric model that considers biophysical attributes, land use, and human development variables ( $R^2 = 0.61$ ). The dynamic deforestation model, implemented in the Dinamica EGO software platform, corresponds well with observed historic deforestation (91% agreement) and will be used in future scenarios simulations. Map produced by Thiago Lima (UFMG).



**Table 1.** Total observed deforested fraction as of 1996 and fractional change in discharge from the 1970s to the 1990s for six gauges in the Araguaia

Discharge (%)

113	/ 1/0	27/0
116	11%	15%
117	12%	16%
119	9%	15%
120	62%	11%
124	60%	18%
	7	1 Daram
Amazonia Cerrado	Pará  Mato Grosso  Tocantin	
Araguaia-Tocantins	Basin Goiás	N
Brazil		

Figure 6. Land cover classification of the 370,000 km<sup>2</sup> Araguaia River basin, derived from Landsat TM and MODIS imagery. Numbers designate the location of six stream gauges, maintained by Brazil's National Water Agency (ANA). Lower right: location of the Araguaia basin within the Cerrado.

#### **Project publications**

Araújo, F.M., Ferreira, L.G., Arantes, A.E. Distribution patterns of burned areas in the Brazilian biomes: an analysis based on satellite data for the 2002 – 2010 period. Remote Sensing, 4, 1929-1946, 2012 (doi:10.3390/rs4071929).

Bowman, M.S., B.S. Soares-Filho, F.D. Merry, D.C. Nepstad, H.O. Rodrigues, and O.T. Almeida, Persistence of cattle ranching in the Brazilian Amazon: A spatial analysis of the rationale for beef production. Land Use Policy, 29, 558-568. 2012.

Castanho A.D.A., M.T. Coe, M.H. Costa, Y. Malhi, D. Galbraith, and C.A. Quesada, 2012: Response of simulated above ground biomass and net primary productivity in the Amazon to spatial and temporal variability in the physical environment, Biogeosciences Discuss., 9, 11767-11813, doi:10.5194/bgd-9-11767-2012.

Ferreira, M. E., L.G. Ferreira, F. Miziara, B.S. Soares-Filho, Modeling landscape dynamics in the central Brazilian savanna biome: future scenarios and perspectives for conservation. Journal of Land Use Science, v. 1, p. 1 - 19, 2012 (online first).

Ferreira, M. E., E.G. Oliveira, and F.M. Araújo, Diagnostic of the land use in the Midwest Region of Minas Gerais, Brazil: The renewal of the landscape by the sugarcane crops and its social and environmental impacts. Sociedade & Natureza, v. 24, n. 3, 545-556, 2012 (Portuguese).

Ferreira, L.G., L.E. Fernandez, E.E. Sano, C. Field, S.B. Sousa, A.E. Arantes, and F.M. Araújo, Biophysical properties of cultivated pastures in the Brazilian savanna biome: an analysis in the spatial-temporal domains based on ground and satellite data. Remote Sensing (in press). Garcia, F.N., L.G. Ferreira, and E.E. Sano, Análise da qualidade das pastagens cultivadas do cerrado goiano a partir de imagens modis índices de

vegetação. Revista Brasileira de Cartografia (in press). Leite, C. M.H. Costa, B.S. Soares-Filho B, and L. Viana, Historical land use change and associated carbon emissions in Brazil from 1940 to 1995.

Global Biogeochemical Cycles. v.26, p.GB2011 - 29, 2012. Lima, L., L.J.C. Oliveira, B.S. Soares-Filho, and H.O. Rodrigues, Balanço hídrico climatológico espacializado para o Brasil. Anais do Congresso

Brasileiro de Meteorologia. 2012. Oliveira, L.J.C., M.H. Costa, B.S. Soares-Filho, and M.T. Coe, Large-scale expansion of agriculture in Amazonia may be a no-win scenario,

Environmental Research Letters (submitted) Silva, E.B., L.G. Ferreira, A.F. Anjos, and F. Miziara, Analysis of the spatial-temporal distribution of cultivated pastures in the Brazilian savanna

biome from 1970 to 2006. Interface em Desenvolvimento, Agracultura e Sociedade (submitted). Soares-Filho B. S., L. Lima, M. Bowman, L. Viana, and C. Gouvello, Challenges for a low carbon agriculture and forest conservation in Brazil. Sustainability Report. IADB. Washington. http://www.iadb.org/sustainability/soares. 2012.













