Evaluating Soil Carbon Efflux Responses to Soil Moisture and Temperature Variations in Brazilian Biomes

By Jonathan Willian Zangeski Novais, Fernando da Silva Sallo, Maria Aparecida Pereira Pierangelli, Osvaldo Borges Pinto Junior, Danielle da Silva Batista & Levi Pires de Andrade

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Keywords: soil carbon efflux, soil temperature, soil moisture, forests, climate change.

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Evaluating Soil Carbon Efflux Responses to Soil Moisture and Temperature Variations in Brazilian Biomes

Jonathan Willian Zangeski Novais a, Fernando da Silva Salo a, Maria Aparecida Pereira Pierangelli b, Osvaldo Borges Pinto Junior c, Danielle da Silva Batista d & Levi Pires de Andrade e

Abstract: Changes in soil moisture and temperature can directly influence soil carbon emissions, which can add carbon to the atmosphere and make the greenhouse effect more intense. In this sense, research is needed that contributes to this knowledge and that simulates future scenarios, allowing actions to be taken in advance. Thus, an experiment was set up in which carbon dioxide efflux was collected over a period of one year in three Brazilian biomes, Cerrado, Pantanal, and Cerrado-Amazonian Ecotone, in order to verify the influence of soil moisture, leaf area index and litter, multiple regression models were carried out. Correlation analyses were performed, and subsequently, sensitivity analyses were conducted for possible efflux increases owing to 2 ºC and 10% decreases or increases in soil temperature and moisture, respectively, simulating possible climate change scenarios. The results showed that of the three study areas, the Cerrado forest was most resistant to changes in these variables, and the correlation between the carbon efflux and the variables, soil temperature and moisture, were positive and significant for Cerrado and Pantanal. However, for the Cerrado-Amazonian Ecotone, only the correlation between the efflux and soil temperature was positive and significant. Additionally, the Cerrado-Amazonian Ecotone was the most sensitive to soil temperature variations, while the Pantanal forest, which showed a 26% increase in emissions owing to a 10% increase in soil moisture content, was the most sensitive to soil moisture variations, highlighting how global warming can interfere with carbon balance. Moreover, the biomes examined in this study present a complex mosaic landscape, with various regions exhibiting distinct responses to climate change. This underscores the importance of alerting government officials and emphasizing the necessity for proactive measures to mitigate soil CO2 emissions. The rise in atmospheric carbon content contributes to the greenhouse effect, reinforcing the urgency of addressing and curbing these emissions.

Keywords: soil carbon efflux, soil temperature, soil moisture, forests, climate change.

1. Introduction

Over the years, there has been a rapid increase in the number of ecosystem warming-related experiments, covering almost all terrestrial biomes, and the results of these studies provide relevant understanding regarding global soil respiration patterns, owing to a warming climate (Wang et al., 2014), in that soil respiration plays a crucial role in regulating carbon cycling in terrestrial ecosystems and the atmospheric carbon dioxide (CO2) concentration (Yang et al., 2022), and respiratory effluxes of carbon from the soil to the atmosphere are expected to rise with temperature, potentially intensifying future climate warming (Yan et al., 2022).

Carbon cycling in ecosystems occurs depending on the balance between CO2 fixation by plants and losses from respiration or physical removal from the soil. This is contingent on gross primary production and litter decomposition over time (Strong et al., 2017). Additionally, it is influenced by the underground environment, encompassing factors such as root biomass (Søe and Buchmann, 2005) and soil microbial biomass (Neergaard et al., 2002). Therefore, to understand the global carbon cycle, it is necessary to identify the factors that interfere with soil carbon dynamics (Neff and Hooper, 2002). Reportedly, it is expected that average global temperatures will rise 2–6 ºC by the end of the century (IPCC, 2007), and this increase may alter soil respiration. Kirshbaum (1995) reported that a rise in temperature by 1 ºC can bring about a 10% increase in carbon emission in regions where the annual mean temperature is 5 ºC.

The effect of soil temperature on carbon dioxide efflux has been sufficiently reported (Bond-Lamberty and Thomson, 2010a; Mahecha et al., 2010), and it is well established that temperature increases can stimulate microbial activity. However, for tropical ecosystems, soil moisture has also been identified as a factor that can affect soil carbon dynamics (Davidson et al., 2000; Adachi, 2006), with peak emissions being recorded at the beginning of the wet period (Chou et al., 2008; Borken and Matzner, 2009; Bowling et al., 2011; Nielsen and Ball, 2015; Wang et al., 2019) justified the need for forecast models, based on climate change scenarios.

Soils represent the most significant carbon store in the world (1500 Gt, e.g. 1.5×1021 g). According to the European Commission (2006), tropical forests contain large amounts of C in vegetation and soil, equivalent to 37% of the global terrestrial C pool (Dixon et al., 1994). In this light, there are several biomes in the Brazilian territory, where it is necessary to evaluate these carbon emissions and the possible variables that influence them. The Amazon rainforest occupies an area...
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II. Material and Methods

a) Study area

The Brazilian savanna, locally known as Cerrado, is part of the conservation unit: the Mãe Bonifácia Park, which is in an urban area, located in Cuiabá, the capital city of the Mato Grosso state, at 15°34′44″S and 56°05′01″W. It covers an area of 77.16 hectares, and its altitude ranges between 164 and 195 m (Joaquim et al., 2018). According to Andrade et al. (2016), which characterized the park’s species, has not undergone relevant anthropic actions that might have altered its biophysical characteristics, is the remaining fragment of the Cerrado in its natural form. Therefore, the park was considered a good representation of the Cerrado biome.

The Cerrado-Amazonian Ecotone is located in the municipality of Tangará da Serra, Mato Grosso state, situated in the southeastern region of Brazil. Referred to as the Ilto Ferreira Coutinho Municipal Park, this conservation unit is located for an urban area and is situated at coordinates 14°37′08″S 57°29′09″W, spanning an altitude of 452 meters, the park encompasses an area of 12 hectares. (Melz and Tiago, 2009).

In the third area, Pantanal, is situated within the Natural Heritage Reserve (RPPN) SESC Pantanal, in the municipality of Poconé-MT, at 16°30′15.20″S 56°24′15.30″W, considered the largest private natural reserve in Brazil, with 1,076 km² (Schuartz et al., 2021).

The three areas climate is classified as Aw, according to the Köppen climate classification, is characterized by hot and humid rainy summers and dry winters (Alvares et al., 2013).

b) Vegetation

To the Cerrado the most abundant vegetative species include Curatella Americana L., Albizia niipoides (Spruce ex Bentham.), Anadenanthera colubrine (Vell.) Brenan, Samanea Tubulosa (Benth.) Bameby and J.W. Grimes., Stryphnodendron adstringens, and Inga vera Willid. Subsp. affinis (DC.). This Cerrado fragment is an area of native vegetation surrounded by anthropic barriers, which significantly impede the movement of animals as well as the flow of pollen or seeds. Isolated environments may contain endemic species due to the long period of isolation, and this makes such environments a priority for conservation (Novais et al., 2018a). In the Cerrado-Amazonian Ecotone there are botanical species, which are also present in the Amazonian and Cerrado forests, with the original vegetation forming a seasonal semideciduous forest, and the most abundant families include Anacardiaceae, Malvaceae, Bignoniaceae, Annonaceae, Apocynaceae, Meliaceae, Mirticaceae, and Rubiaceae, of which 81% of the species are native to the region (Rodrigues, et al., 2015). And to the Pantanal the predominant species is Scheelea phalerata (family Arecaceae), which is popularly known as Acuri.

c) Soil type

Alic Cambisol is the predominant soil in the Cerrado region, which is a typical mineral soil that is well drained, has a medium depth, with the presence of iron concretions along the profile in amounts greater than 50% of the volume. To Cerrado-Amazonian Ecotone there are two soil types, Red Dystrophic Latosol (Red Latosol) and Hydromorphic Quartzenic Neosol. And to the Pantanal, the local soil is classified as Hapluc Eutrrophic Planosol, according to Gava et al. (2013).

d) Soil carbon efflux and meteorological variables

Between August 2015 and July 2016, July 2017 and June 2018, and February 2014 and January 2015, five sample points, with a separation of approximately 10 meters, were selected in Cerrado, the Cerrado-Amazonian Ecotone, and Pantanal, respectively. At these points, measurements were made at one h-intervals, from eight am to four pm. Thus, a total of 540 samples were collected per year for each location.
Subsequently, the collections from the five monitored points were averaged. The soil carbon efflux measurements were performed using a portable infrared gas analyzer (EGM-4, PP systems, Amesbury, MA, USA) connected to a soil CO₂ flow chamber (SRC-1, PP Systems, Amesbury, MA, USA). Air temperature and relative humidity measurements were made using a portable microclimate station (Kestrel 4500 Weather Tracker, NK Company, Boothwyn, PA, USA), and at a soil depth of 5 cm, soil temperatures were measured using a digital thermometer (Instrutherm TE-300, São Paulo, SP, Brazil) and soil moisture measurements were made monthly using the gravimetric method. Precipitation data was obtained from the National Meteorological Institute (INMET, 2018). Except for Pantanal, that leaf area index (LAI) was not collected, in the other study areas was measured using a linear ceptometer (AccuPar-LP 80, Decagon Devices, Washington, USA), and monthly averages were taken for all variables.

A collector with an area of 1 m² placed at a height of 1.20 m was used to obtain litter. The litter produced was collected monthly, then stored for subsequent drying in a circulating oven for 72 hours. Afterward, it was weighed using a semi-analytical balance (Scoriza, 2012).

e) Statistical analyses

Soil moisture, litterfall, and leaf area index (LAI) were subjected to regression analyses to explore the interdependence of these variables, which play crucial roles in soil CO₂ efflux. The aim was to identify models that accurately describe the field experimental data gathered at the three sites. Furthermore, an examination of the impact of soil temperature and moisture on effluxes was conducted, with sensitivity analysis providing insights into potential scenarios related to climate change.

After conducting normality and homoscedasticity tests, Spearman correlation tests (ρ) were employed to explore potential correlations among the variables. The Tukey test was then utilized to compare groups. Additionally, p values ≤ 0.05 were deemed statistically significant. Consequently, these datasets will facilitate the analysis of soil CO₂ efflux, enabling the establishment of regression models.

III. Results and Discussion

a) Characterization of variables

The analysis of the monthly litterfall (S), soil carbon efflux, precipitation (Ppt), leaf area index (LAI), soil temperature (Tₛ), and soil humidity (θₛ) variations corresponding to the Cerrado, the Cerrado-Amazonian Ecotone, and the Pantanal forests are shown in Figure 1.
Figure 1: Monthly averages of soil carbon efflux, litterfall (S), leaf area index (LAI), precipitation (Ppt), soil temperature (Ts), soil moisture (θs), for Cerrado (Black), Cerrado-Amazonian Ecotone (Gray), and Pantanal (White) forests.
The annual averages of the soil carbon efflux were 6.52 ± 2.31, 2.12 ± 0.81, and 5.91 ± 2.03 for the Ecotone, the Cerrado, and the Pantanal forests, respectively. Additionally, there was no significant statistical difference (p < 0.05) between the flows in the Cerrado-Amazonian Ecotone and the Pantanal forests. Maximum emissions (9.96 and 4.19 µmol·m⁻²·s⁻¹, respectively) were observed in March 2018 to the Ecotone and Cerrado, and the maximum emission (8.37 µmol·m⁻²·s⁻¹) was observed in December 2014 to Pantanal.

The litter production values for Pantanal and the Ecotone, as well as those for Cerrado and the Ecotone, were found to be statistically different (p < 0.05). However, the values corresponding to the Cerrado and Pantanal forests did not exhibit a significant difference. In September, both the Ecotone and Cerrado forests displayed their highest litter production, at approximately 0.325 kg·m⁻² and 0.15 kg·m⁻², respectively. It is noteworthy that the Ecotone and Cerrado forests produced the highest litter amounts during this month. In a study by Costa et al. (2022), it was reported that the dense Cerrado, exhibiting characteristics closer to the ecotone, had a monthly average litter production of 0.37 kg·m⁻².

In the Pantanal, the highest level of litter production (0.10 kg·m⁻²) was observed in August 2014, values close to those found by Pinto Jr. et al. (2018) for the same month and biome. August and September months were considered as dry periods (Vourlitis and da Rocha, 2011), during which the plants in deciduous forests lose leaves the most as a result of water stress (Pavão et al., 2018), justifying these results.

This pattern was found to be reversed for the leaf area index (LAI), which as the rain starts, increases owing to the production of new leaves (Novais et al. 2018b), and corresponding to a significant positive correlation coefficient (p < 0.01), i.e., 0.74 and 0.84 for LAI and precipitation in Cerrado and the Cerrado-Amazonian Ecotone, respectively. There was a statistically significant difference (p < 0.001) between the LAI results for the Cerrado and Ecotone, 4.64 ± 1.38 and 7.6 ± 1.92 m²·m⁻², respectively.

The average annual soil temperature and soil moisture for Cerrado, Pantanal, and the Ecotone were 25.08 ± 3.40 °C and 10.60 ± 4.61%, 26.37 ± 2.13 °C and 13.52 ± 5.62%, and 23.88 ± 1.35 °C and 11.30 ± 5.73%, respectively. Correlation analysis showed that there was a positive and significant correlation between soil moisture and efflux in Cerrado and Pantanal (ρ = 0.755 and ρ = 0.629, respectively), and the correlation with soil temperature was not significant. However, for the Ecotone, a positive and significant correlation was observed between the efflux and soil temperature (ρ = 0.893 and p < 0.001), while that between soil moisture and the efflux was insignificant (ρ = 0.683).

b) Models

According Table 1, the regression models were set up from a combination of environmental variables or/and vegetation parameters.

### Pantanal - Regression Model:

\[
E_{flux} = aT_s^2 + b \left( \frac{T_s^{0.2}}{\theta_s} \right)^{2.5}
\]

<table>
<thead>
<tr>
<th>Parameters</th>
<th>Value</th>
<th>p-value</th>
<th>R²</th>
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</thead>
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<tr>
<td>a</td>
<td>0.011</td>
<td>&lt; 0.001</td>
<td>0.745</td>
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<tr>
<td>b</td>
<td>-134.44</td>
<td>&lt; 0.001</td>
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</table>

### Ecotone - Regression model:

\[
E_{flux} = aT_s^{2.4} + b \left( \frac{\theta_s}{T_s} \right)^{0.4} + cI_S^{0.4}
\]

<table>
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<th>Parameters</th>
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<tr>
<td>b</td>
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<td>&lt; 0.05</td>
<td></td>
</tr>
<tr>
<td>c</td>
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<td>&lt; 0.01</td>
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</table>

### Cerrado - Regression model:

\[
E_{flux} = aT_s^{0.25} + b \left( \frac{\theta_s^{1.25}}{T_s^{0.25}} \right) + cS_{SI}^{3}
\]

<table>
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<th>Parameters</th>
<th>Value</th>
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<th>R²</th>
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<td>0.916</td>
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<tr>
<td>b</td>
<td>0.0655</td>
<td>&lt; 0.05</td>
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<tr>
<td>c</td>
<td>2.20E-08</td>
<td>&lt; 0.001</td>
<td></td>
</tr>
</tbody>
</table>

* LAI = leaf area index; Ts = soil temperature; \( \theta_s \) = soil moisture; I_S = LAI/S; S_I = S/LAI
The environmental variables that were part of all the models were $T_s$ and $\theta_s$, which are possibly the main drivers of the efflux. In previous studies, it has been reported that these variables control soil respiration (Davidson et al., 1998; Davidson et al., 2006; Liu et al., 2019); however, in this study, it appeared that the soil efflux further depended on other controlling variables, such as LAI and S, except for Pantanal, for which data on LAI was not available for the same period; thus, the combination of LAI and S was not possible. This possibly had an effect on the accuracy of the regression model ($R^2 = 0.745$), which was substantially lower for this site compared with the Ecotone ($R^2 = 0.832$) and Cerrado ($R^2 = 0.916$), respectively. Additionally, for Pantanal and the Ecotone (Figure 2) the regression model underestimated the monthly efflux after January given that the magnitude of their dependent variables ($T_s$ and $\theta_s$) did not change sufficiently to capture the efflux that primarily increased from the month of March (Figure 2).

In general, all the models had a high goodness-of-fit for efflux, and captured the dynamics and magnitude of observed efflux data. The models results suggest that the litter supply associated with an increase in ventilation, incident radiation, and soil evaporation, and a decrease in LAI, influence the soil carbon efflux. Thus, they can contribute to enhancing our understating of the efflux dynamics in tropical regions, based on the results of previous studies (Valentini et al., 2008; Lathuillière et al., 2017). Additionally, the regression models accurately described most of the efflux variations throughout the months for all the study sites, and could also perform additional analyses, such as the determination of the sensitivity of the efflux to the variables, $T_s$ and $\theta_s$.

c) Regression models and analysis of efflux sensitivity to $T_s$ and $\theta_s$

The sensitivity analysis tested the effect of the relevant dependent variables that were included in the regression model, i.e., $T_s$ and $\theta_s$, on the efflux (Table 2).
The soil carbon efflux at the Cerrado site appeared to be unaffected by Ts or $\theta_s$, since the positive and negative changes in the magnitude of the efflux were considerably smaller than those corresponding to the Ecotone and Pantanal. This is an interesting finding because it showed that the observed efflux increased in response to a local increase in S (February), meaning that litter supply plays an important role in litter decomposition and CO$_2$ emission. Moreover, the regression model for Cerrado may be able to describe the local emission peak via the inclusion $S_i$ variable. The Ecotone and Pantanal sites appeared to be more sensitive to Ts and $\theta_s$, even though the Ecotone site showed more sensitivity to Ts than $\theta_s$. When the soil moisture content varies by 10%, the expected variation in efflux was not significant compared with the 17.4% increase in the efflux that resulted from an increase in Ts by 2 ºC. This observation confirmed the strong correlation between the efflux and Ts observed at this site ($\rho = 0.893$ and $\rho < 0.001$). The model was sensitive to variations of 2ºC and 10% for Ts and U in the Pantanal, resulting in a 26% increase in soil carbon efflux. This value is 7% higher compared to the model that only changed the temperature, being similar to Wang et al. (2014), who reported an increase in emissions of approximately 21% owing to a 2 ºC rise in temperature.

Even though these sites are located less than 215 km apart, their soil types, vegetation characteristics, and climates are considerably different, and these differences were responsible for the distinguishing results. Additionally, the results obtained in this study further confirmed that the Mato Grosso state presents a complex mosaic landscape that may respond differently to climate changes. Therefore, it may be necessary to consider specific solutions that seek to establish sustainability as well as preventive actions to mitigate soil CO$_2$ emissions. Once climate change is present, it is necessary to monitor carbon emissions in these biomes for a longer period to improve mathematical models and to advance the environmental management of the most sensitive areas. Given the fact that tropical ecosystems may be responsible for approximately 67% of the total annual global CO$_2$ efflux (Bond-Lamberty e Thomson, 2010b) changes in litter production and efflux due to climate and land-use change have important implications for global CO$_2$ cycling. This serves as an alert to government officials and highlights the need for preventive actions to mitigate soil CO$_2$ emissions (Pinto Jr. et al., 2018).

IV. Conclusion

In this study, a positive and significant correlation was observed between soil moisture content and the efflux in Cerrado and Pantanal. However, in the Ecotone, an opposite observation was made; a positive and significant correlation existed only between soil temperature and efflux. These correlations allow us to increase our understanding of which variables influence carbon emissions. Another important result is that combinations of leaf area index and litterfall can be used to facilitate the representation of efflux seasonality. Compared to other locations, the Cerrado forest was the least sensitive to changes in temperature and humidity. For the Ecotone and Pantanal, an increase in soil temperature by 2 ºC resulted in an increase in carbon emissions by 19.7 and 26%, being a worrying result, given that these regions are constantly being deforested. Additionally, the biomes analyzed in this study have a complex mosaic landscape with regions that respond differently to warming, being recommended that this type of experiment be applied in more locations in this Brazilian region, in order to understand how changing vegetation cover influences carbon emissions.

Funding

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References Références Referencias


Table 2: Analysis of sensitivity of soil carbon efflux for soil temperature (Ts) and soil moisture ($\theta_s$) for Cerrado-Amazonian Ecotone, Pantanal and Cerrado.

<table>
<thead>
<tr>
<th>Variables</th>
<th>Cerrado</th>
<th>Cerrado-Amazonian Ecotone</th>
<th>Pantanal</th>
</tr>
</thead>
<tbody>
<tr>
<td>Ts+2ºC</td>
<td>0.6%</td>
<td>17.4%</td>
<td>19%</td>
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<tr>
<td>Ts+2ºC and $C_O$-10%</td>
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<td>19.7%</td>
<td>9.7%</td>
</tr>
<tr>
<td>Ts+2ºC and $C_O$+10%</td>
<td>4.0%</td>
<td>15.2%</td>
<td>26%</td>
</tr>
</tbody>
</table>
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