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## **Gross primary production using related vegetation indices**

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### **Abstract**

The assessment of carbon dynamics in terrestrial ecosystems is of great importance in global climate change research. Caatinga is an exclusively Brazilian biome, and quite

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lacking in studies, particularly of carbon sequestered by biome. A major difficulty for studies is a function of no observation data in micrometeorological station. The hyperspectral and multispectral remote sensing become increasingly feasible to evaluate the dynamics of carbon in ecosystems, in particular in this Caatinga study area. The objective of this study was to apply correlation analysis and multiple regression to find a relationship between gross primary production (GPP) and vegetation cover index in the Caatinga biome, located in vicinities of Petrolina city, Pernambuco State, Brazil. It was used a HandHeldFieldSpec of ASD to obtain the reflectance data of plant canopy and the vegetation indices. The GPP data were obtained in micrometeorological tower installed into a preserved area of Caatinga biome. The results showed that those vegetation indexes which take water into consideration presented higher correlation with GPP,  $r^2=0.95$ . We conclude that it is possible to obtain GPP using only data of vegetation indexes estimated with remote sensing.

**Keywords:** Spetroradiometry, Caatinga, ecosystems, reflectance.

## Introduction

The Caatinga is an exclusively Brazilian biome, comprising a total area of 826411 km<sup>2</sup> in nine Brazilian states, representing about 11% of Brazilian territory. In spite of its biological importance, the Caatinga is the third most degraded biome in Brazil (about 45.3% of the Caatinga area was remodified, mainly by human pressure) and the less studied and protected. In addition, the continued exploitation of natural resources and the devastation of native vegetation in Caatinga biome have been causing environmental impacts, and changing carbon (C) and nitrogen (N) cycles (Giorgio et al., 2011). These two elements are the most important elements for maintaining the ecosystem dynamic, and are, also, associated to climate change.

The carbon quantification of above-ground, and more particularly below-ground biomass is difficult in agroforestry systems, besides its importance. Some recent research has determined the carbon sequestration for ecosystems in semiarid and arid lands (Domingo et al., 2011; Luo, et al., 2011; Sousa et al., 2012), also using remote sensing tools (Inoue et al., 2008; Moran et al., 1997; Inoue, 2003; Olioso et al., 2005). According to Xiao et al (2011), an accurate estimation of the spatial patterns and

temporal dynamics of NEE in terrestrialecosystems at the regional and global scale is of great interest to human society and is necessary for understanding the carbon cycle of the terrestrial biosphere.

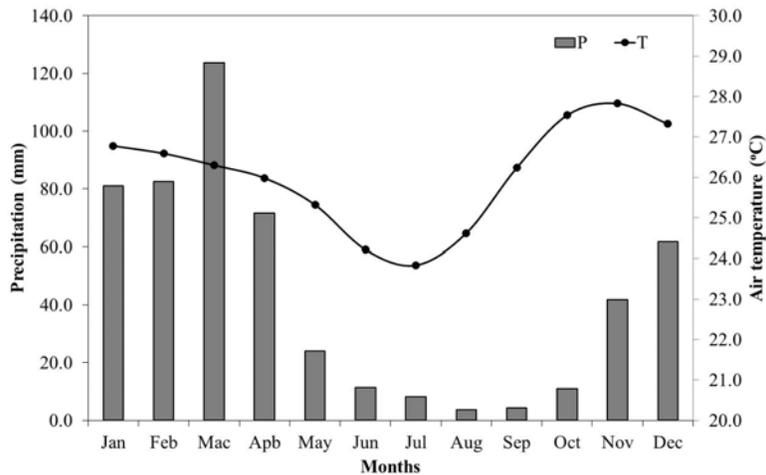
Caatinga biome has a lack of studies about C dynamic and energy exchange process, and this kind of information it is necessary to understand soil-vegetation-atmosphere interactions (Giorgio et al., 2011). It is necessary to know how Caatinga act, if its biome would be identified as an important sink or drain for atmospheric CO<sub>2</sub>.

The objective of this study was to apply correlation analysis and multiple regression to find a relationship between gross primary production (GPP) and vegetation cover index in the Caatinga biome, located in vicinities of Petrolina city, Pernambuco State, Brazil.

## **Data e Methods**

### **Site description**

The studied plot is located in a native area of the Caatinga Biome, Petrolina, Pernambuco State, Brazil. This area belongs to Embrapa Tropical Semi Arid and integrate the Site 22 of the Programa Ecológico de Longa Duração – PELD. The climate is semi arid, with mean annual temperature of 26.0 °C, a mean rainfall of 525.7 mm which is concentrated mostly in four months (from January to April; Fig. 1). Average minimal value for air temperature was 23.8°C in July, while the maximum occurred in November (27.8°C) (Fig. 1).



**Figure 1.** Average monthly precipitation (P, mm) and air temperature (T, °C) for the last 40 years in Petrolina, Pernambuco State, Brazil.

### Micrometeorological and flux measurements

It was used micrometeorological data from a 16 m tall instrument tower fixed at the Caatinga Biome, Brazilian semi-arid. A set of meteorological instruments mounted on the tower were used to continuously monitor environmental conditions. For the purpose of the study, it was used data for 16<sup>th</sup>, June, 2011. Incoming solar radiation (R<sub>g</sub>), reflected solar radiation (R<sub>r</sub>), atmospheric and surface longwave radiation were measured by a four-component net radiometer (CNR1, Kipp&Zonen, Delft, The Netherlands). Incoming photosynthetically active radiation (PAR) was measured with a quantum sensor (LI-190SA, LI-COR Inc., Lincoln, Nebraska, USA), while a downward looking quantum sensor (LI-190SA, LI-COR Inc.) measured the PAR reflected by surface. An air temperature and relative humidity probe (HMP45C (Vaisala Inc.) was mounted on the tower, and thermistors (107B Soil Temperature Probe, Campbell Scientific) were fixed at 2 and 8 cm depths below the surface. A tipping-bucket rain gauge (CS700, Campbell Scientific), located on the top of the tower, was used to measure total event precipitation. It was used a pair of line quantum sensor (LI-191, LI-COR Inc., Lincoln, Nebraska) to measure the PAR below canopy. The fraction of absorbed photosynthetically active radiation (fAPAR) was derived from PAR measurements. All meteorological sensors were scanned at 30-s intervals and recorded as half-hourly means by a data logger (CR1000) and a multiplexer (AM16x32).

The eddy covariance (EC) system consisted of a threedimensional sonic anemometer–thermometer (CSAT3, Campbell Scientific), mounted at 16 m height, and a fast response infra-red gas analyzer (IRGA, LI7500, LI-COR), used to simultaneously measure changes in CO<sub>2</sub> and H<sub>2</sub>O molar densities. The eddy covariance (EC) technique (Baldocchi et al., 1988; Aubinet et al., 2000; Baldocchi, 2003) was used to measure net ecosystem fluxes of CO<sub>2</sub>, water vapour (or latent heat, LE) and sensible heat (H).

### **Hyperspectral reflectance measurements**

Reflectance data were collected under clear sky conditions (june 16<sup>th</sup>) in 2011. Canopy radiance data were collected from 400 to 1000nm using a portable spectroradiometer (HandHeld, ASD, USA), with field of 258 normal to the canopy located at a distance of approximately 2m from the canopy surface. Vegetation reflectance measurements were taken by averaging 5 scans at optimized integration times. We conducted four collected (North-South-East-West) onto four sampling points, totaling 16 points. In this study we plotted four points concerning the mean (average of four collected - North-East South-West) for each geographic area. Reflectance spectra were derived through calibrations relative a 99% white reference panel. Calibration panel reflectance measurements were taken before and after the vegetation measurements.

### **Vegetation Indexes**

#### **WDVI- Water Difference Vegetation Index**

To fully explore the hyperspectral data, different kinds of vegetation indexes were calculate (Galvıncio et al., 2012), and among then the Water Difference Vegetation Index – WDVI was that on with the best fit with GPP data.

$$WDVI=R830-1.06R660 \quad (1)$$

where R830 is the reflectance in 830nm and R660 is the reflectance in 660nm.

#### **Broadband NDVI**

The definition of NDVI utilizes differences in leafabsorptance in the red and near-infrared regions, but Huemmrich et al. (1999) replaced the red domain withPAR and the near-infrared with an optical infrared domainin order to use the upward and

downward PAR and global radiation sensors measurements. Thus, the broadband NDVI was calculated according to Wang et al. (2004).

## Statistics

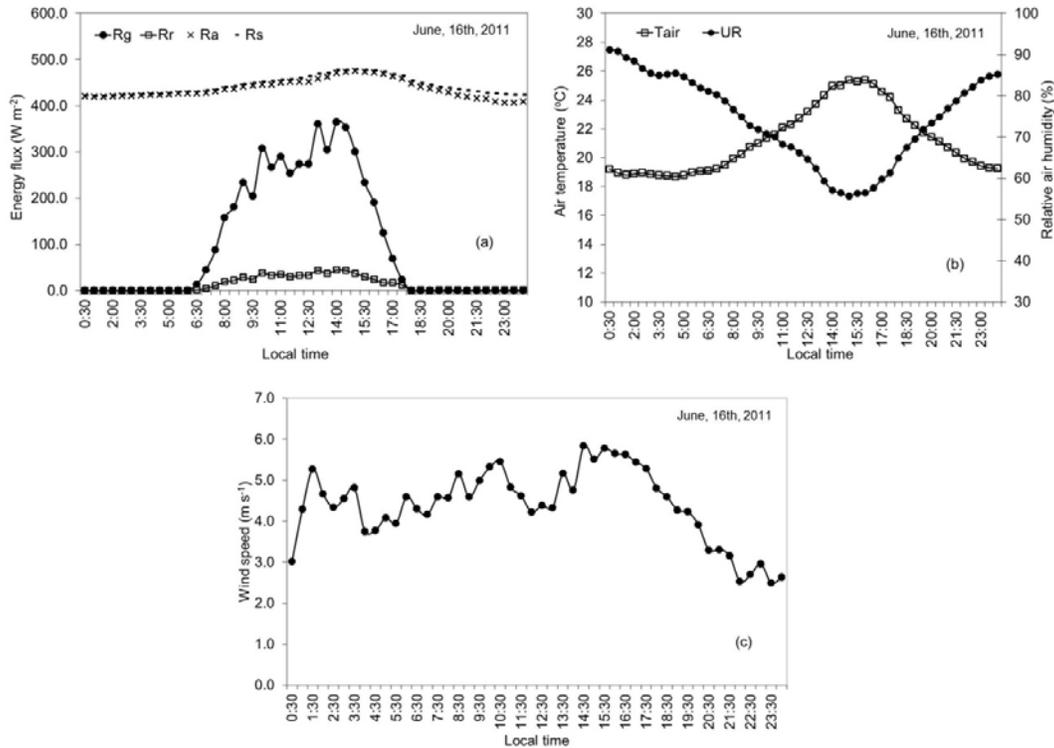
Was applied to analysis of linear correlation and regression to assess the degree of accuracy between the data of GPP with Fieldspec and observed at the station. The equations of correlation and regression using have by Galvncio & Souza, 2002.

## Results and discussion

### Meteorological Conditions

The 30-min values of the incoming solar global radiation ( $R_g$ ), reflected solar radiation ( $R_r$ ), atmospheric longwave radiation ( $R_a$ ), surface longwave radiation ( $R_s$ ), air temperature ( $T_{air}$ ), air relative humidity (RH), and wind speed over Caatinga vegetation on 16<sup>th</sup> June, 2011, in Petrolina, PE, Brazil are revealed in Fig. 2. As shown in Fig. 2a, the variations of incoming ( $R_g$ ) and outgoing ( $R_r$ ) solar or shortwave radiation presented, respectively, the maximum of radiation density fluxes about  $360.23 \text{ W m}^{-2}$  and  $44.28 \text{ W m}^{-2}$  around midday. The average of the ratio  $R_r/R_g$  for this day results on 13% of albedo for the Caatinga vegetation. On the same Fig. 2a, values of incoming longwave atmospheric ( $R_a$ ) and outgoing longwave terrestrial ( $R_s$ ) are similar, and present small variation during the day (422 to  $479 \text{ W m}^{-2}$ ). From Fig. 2a can be also observed the presence of clouds during the day. The net radiation ( $R_n$ ) represents the budget of the total incoming and outgoing radiation, and for the 16<sup>th</sup> June, 2011, the cumulative  $R_n$  was about 65% of the incoming solar radiation.

Fig. 2b depicts the 30-minute values of the air relative humidity and temperatures. The maximum and minimum RH reached about 91.1% and 56.5% during the 16<sup>th</sup> June, 2011, in the Caatinga area. The maximum and minimum air temperatures were about  $25.4 \text{ }^\circ\text{C}$  and  $18.7 \text{ }^\circ\text{C}$ , respectively. The daily average of the air relative humidity and temperature was about 75% and  $21^\circ\text{C}$ , respectively. The wind speed measured at 16m over the Caatinga surface is characterized on Fig. 2c. Can be observed values ranging from 2.5 to  $5.8 \text{ m s}^{-1}$  being the maximum about 14h30 and the lower value during the night time.



**Figure 2.** Diurnal pattern of (a) radiation balance, where Rg is the incident solar global radiation, Rr is the reflected solar radiation, Ra is the atmospheric longwave radiation and Rs is the surface longwave radiation; (b) air temperature, Tair and air relative humidity, UR, and (c) wind speed over Caatinga vegetation on 16<sup>th</sup> June 2011, Petrolina, PE, Brazil.

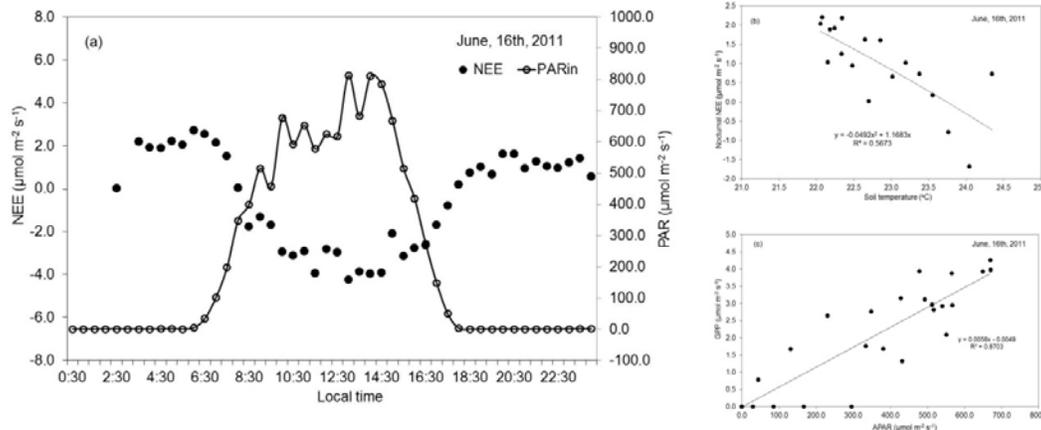
### CO<sub>2</sub> Flux

Fig. 3 shows the 30-minute changes in NEE in the Caatinga field for 16<sup>th</sup> June, 2011. The NEE was strongly affected by incoming PAR intensity. Nighttime NEE, i.e., ecosystem respiration (Re), ranged around from -2 to +2  $\mu\text{mol m}^{-2} \text{s}^{-1}$  and was correlated with soil temperature and expressed as linear function (Fig. 3b). Otherwise, other equations should be developed to better represent the relationship between Re and soil and air temperature for Caatinga biome.

GPP values could represent better the photosynthetic activity of ecosystems and may be derived from NEE and Re (Re is the sum of plant and microbial respiration), following the Eq. (2):

$$\text{GPP} = -\text{NEE} + \text{Re} \quad (2)$$

Note that NEE is positive when CO<sub>2</sub> is emitted from the ecosystem into the atmosphere, while GPP and Re are both positive.

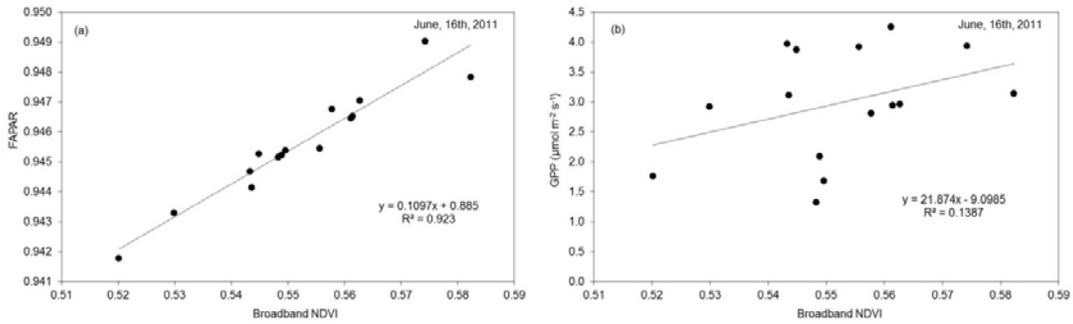


**Figure 3.** Net ecosystem CO<sub>2</sub> exchange (NEE) and incident PAR (a); relationship between nocturnal NEE and soil temperature (b); and, correlation between GPP and APAR over Caatinga biome measured by eddy covariance method on 16<sup>th</sup> June, 2011, Petrolina, PE, Brazil.

### Broadband NDVI and its relationship

The NDVI is sensible to changes in the leaf area, pigments and water relations in plants. So, comparisons at flux tower locations such as Caatinga can provide useful insight into the coupling of phenology, ecosystem physiology, and remote sensing. For this study, broadband NDVI was calculated from measurements of PAR and global radiation over the canopy on 30-minute basis for the studied day and related to FAPAR and GPP obtained by flux tower measurements.

Fig. 4 shows the scatter diagrams of broadband NDVI and FAPAR (Fig. 4a) and GPP (Fig. 4b) for weather conditions on 16<sup>th</sup> June, 2011. The best fit was observed with FAPAR ( $R^2 = 0.923$ ), but it is necessary to analyze the relationship under different weather conditions and status of the vegetation to be more confident about the results, since the caatinga vegetation presents deciduous species and its behavior depends of the soil water availability.

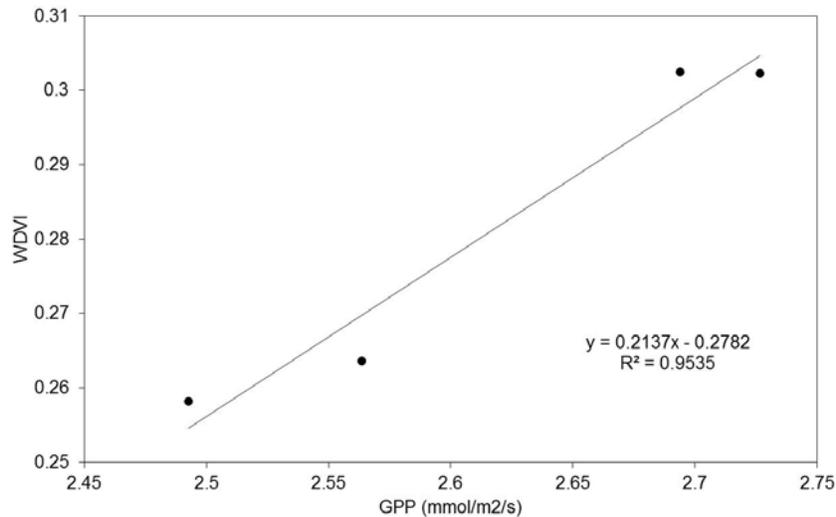


**Figure 4.** Daily course in broadband NDVI and FAPAR (a) and GPP (b) over Caatinga biome measured by eddy covariance method on 16<sup>th</sup> June, 2011, Petrolina, PE, Brazil.

The broadband NDVI and GPP relationship was weak. Galvncio et al., (2012) studied the relationship between NDVI and GPP using handheld spectroradiometer and observed weak correlation ( $r^2 = 0.20$ ), similar to observed on this actual study (Fig. 4b). On the same way, Wang et al. (2004) determined correlation between NDVI and GPP with  $r^2$  around 0.53 (weak correlation).

For this study, the relation between WdVI and GPP was determined by a handheld spectroradiometer and the results are presented on Fig. 5. It was observed strong correlation of GPP with WdVI ( $R^2 = 0.95$ ), and the fit equation to estimate GPP is presented on equation 3:

$$GPP = \frac{WdVI + 0.2782}{0.2137} \quad (\text{mmol/m}^2/\text{s}) \quad (3)$$



**Figure 5.** Relationship between GPP and WdVI measured by handheld spectroradiometer over Caatinga biome on 16<sup>th</sup> June, 2011, Petrolina, PE, Brazil.

## Conclusion

The use of eddy covariance and hyperspectral reflectance measurements over Caatinga biome presented strong correlation between vegetation index - WdVI and GPP, and it was developed a new equation to estimate GPP.

This kind of study must be continued. It is necessary to analyze the CO<sub>2</sub>, water and energy fluxes and its relationship with vegetation indexes under different weather conditions and status of the vegetation to be more confident about the results, since the caatinga vegetation presents deciduous species and its behavior depends of the soil water availability.

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