



# HYPERSPECTRAL DATA FOR PREDICTION OF LEAF NITROGEN CONTENT IN SUGARCANE

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Nitrogen is an essential nutrient for crop production, interacting in a very complex system with environment, so its monitoring is therefore important, both economically as well as environmentally.

There is wide variation in the literature regarding the best dose to be applied in sugarcane, and these differences are directly related to the variety, soil type, and area and cropping system. Thus, the need to develop a tool to determine the nutritional status of sugarcane in different growing conditions is evident, in order to minimize costs, maintain or increase productivity without impacting environmental integrity.

As has been noted, the use of

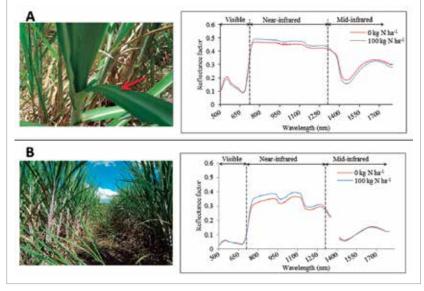


Figure 1. Responses of spectral reflectance of sugarcane at leaf (A) and canopy (B) level, grown on sandy soil, 2013-2014 harvest, using different doses of Nitrogen: stressed (0 kg N ha<sup>-1</sup>) and unstressed (100 kg N ha<sup>-1</sup>)

remote sensing has expanded in agricultural sciences, providing a useful tool to monitor and manage such activities, including the nitrogen fertilizer administration on crops.

The spectral behavior of sugarcane, through the reflectance curves, makes it possible to estimate various parameters based on the overall condition of the plant. Each range of wavelength yields a different spectral response curve that allows us to predict some physiological states. Therefore, a study on monitoring nitrogen in the culture of sugarcane using hyperspectral sensors is necessary.

Evaluations are performed at different growth stages of sugarcane in a permanent plot of land used for field experiments of São Paulo Agency for Agribusiness Technology, which studies effects of different nitrogen doses in some sugarcane varieties. Spectral readings are held of leaf and canopy; leaves (+1) area collected and sent to laboratory for leaf analysis to determine nitrogen content. These data will be used to generate spectral models of multiple linear regression to predict the leaf nitrogen content, thus detecting the wavelengths that are more related to the plant nitrogen status.

This study aims to show the results that may guide future applications of spectral data to monitoring sugarcane nitrogen fertilization, as new research and development of dedicated sensors for the culture.



## SUMMARY OF RESULTS TO DATE AND PERSPECTIVES

The project consists in the temporal analysis of the sugarcane (*Saccharum spp. L.*) leaf and canopy spectral behavior in different production environments, under the effect of different nitrogen doses. In 2013-2014 harvesting, the precipitation of several months was lower than the historical average recorded which may influence the crop growth, and consequently the reduction of leaf area, due to the provision of smaller amounts of water during the early growth stages, increasing stress in plants in all treatments with different nitrogen doses.

Preliminary results have shown a difference in the spectral behavior of sugarcane leaves, when average curves were compared between the stressed and unstressed treatments in the different environments. The visible spectral region (400 to 700 nm) of unstressed leaves curves has showed lower reflectance values with opposite behavior near-infrared region (750 to 950 nm).

As the concentration of pigments such as carotenoids, xanthophylls, and anthocyanins cause variations in the visible spectral region, the stressed plants tend to turn clear yellowish-green foliage, while vigorous plants leaves turn to shades of dark green.

For canopy spectral behavior analysis, biometric variables are compared to the average of spectral curves, showing that it is possible to establish meaningful relationships between agronomic variables of culture and the spectral variables obtained by remote sensing; whose spectral parameters can describe the conditions of vigor and development of sugarcane.

Although the canopy spectral curves are more susceptible to interferences from external factors (climate, plant architecture, soil and others) during the collection of data, these curves showed the same pattern of leaves spectral curves measured in a controlled environment.

For both curves, the same tendency regarding the leaf nitrogen content was observed, wherein the stressed plants (0 kg ha<sup>-1</sup>) have showed a higher reflectance intensity in the red region (660nm) and lower reflectance in the near infrared region (840nm); and unstressed plants (100 kg N ha<sup>-1</sup>) had the typical curve of healthy vegetation, with lower reflectance intensity in the red region and higher in the near infrared region.

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