## CONTINUUM REMOVAL ANALYSIS OF THE CHLOROPHYLL ABSORPTION FEATURE TO DETECT PLANT STRESS INDUCED BY LIQUID HYDROCARBON CONTAMINATION

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This work explores the continuum removal (CR) technique to detect plant stress in visible/near infrared wavelengths. The red edge of the 680 nm chlorophyll absorption is a key feature in plant stress studies (e.g., [1], [8], [7]). The CR transformation consists of estimating the absorptions not due to the band of interest and removing their effects [2]. The CR technique normalises the reflectance spectrum and isolates absorption features to allow comparison between absorption bands on a common basis [4]. The CR method was initially used in geological remote sensing and was first applied to studies of leaf biochemistry by [5], [6] demonstrated that the distinction between healthy and contaminated plant samples was improved when analysing the continuum-removed reflectance compared to reflectance and first derivative of reflectance data. In that study, they applied the CR using fixed continuum channels (e.g. 550-570 nm). Pre-stipulated wavelengths (i.e. left and right channels) used to determine the continuum line for the CR of a specific absorption feature can be adjusted for each sample to better represent the feature (PRISM software, [3]). In the present study, a time series of close range canopy reflectance data of a grass plant species (Brachiaria brizantha) grown in liquid hydrocarboncontaminated (diesel - DSL; gasoline-GSL) soil was acquired with a portable spectrometer (ASD FieldSpec® 3 Hi-Res). The parameters describing the chlorophyll 680 nm absorption feature (continuum channels, depth, width, and area) were derived using the CR applied to the spectra using fixed (FIX) and adjusted (ADJ) continuum channels. Differences between CR-FIX and CR-ADJ results are observed in Figure 1 for all parameters but the feature centre (Table 1). Left and right channels of the continuum line differs some 16 nm and 8 nm on average, respectively, for the FIX and ADJ methods. In addition, the mean depth, width (FWHM - full width at half maximum) and area of the 680 nm feature yielded with the ADJ technique showed higher values. The analysis of the parameters estimated for the 680 nm absorption feature (CR-ADJ) for each of the contamination treatments, indicates that plants stressed by DSL and GSL display mean values of depth, width and area substantially lower than healthy plants (CTR) (Table 2). The results imply that to better characterize an absorption feature, the application of the CR technique using adjusted channels is superior and should be favoured in the analysis. Plant stress in brachiaria grass induced by the contamination of soil with DSL and GSL can be detected with spectral feature analysis focusing on the depth, width or area of the 680 nm chlorophyll absorption feature.

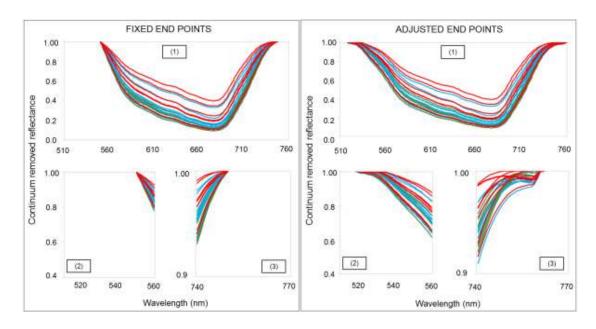


Figure 1. Continuum removed reflectance using fixed (FIX) and adjusted (ADJ) continuum channels for: (1) the 680 nm chlorophyll absorption feature. (2) Zoom in the wavelengths smaller than 560 nm and. (3) Zoom in the wavelengths greater than 740 nm. The curves in green, blue and red correspond to the samples of the control (CTR), contaminated with diesel (DSL) and contaminated with gasoline (GSL), respectively.

Table 1. Statistics of the 680 nm chlorophyll absorption feature parameters of all samples analysed using continuum removal with fixed (FIX) and adjusted (ADJ) continuum channels. The mean differences between fixed and adjusted parameters are highlighted in grey.

	Left channel	Right channel	Center	Denth	FWHM	Area
Minimum						84
						124
						107
SD	0	0	0	67	7	14
Minimum	518	756	678	702	131	87
Maximum	529	761	679	901	152	129
Mean	525	760	678	830	143	111
SD	5	2	0	66	8	15
Minimum	-23	4	0	3	2	3
Maximum	-12	9	0	2	4	5
Mean	-16	8	0	2	3	4
SD	5	2	0	0	0	1
	Minimum Maximum Mean SD Minimum Maximum Mean SD	Maximum       550         Mean       550         SD       0         Minimum       518         Maximum       529         Mean       525         SD       5         Minimum       -23         Maximum       -12         Mean       -16         SD       5	Minimum       550       750         Maximum       550       750         Mean       550       750         SD       0       0         Minimum       518       756         Maximum       529       761         Mean       525       760         SD       5       2         Minimum       -23       4         Maximum       -12       9         Mean       -16       8         SD       5       2	Minimum         550         750         678           Maximum         550         750         679           Mean         550         750         678           SD         0         0         0           Minimum         518         756         678           Maximum         529         761         679           Mean         525         760         678           SD         5         2         0           Minimum         -23         4         0           Maximum         -12         9         0           Mean         -16         8         0           SD         5         2         0	Minimum         550         750         678         699           Maximum         550         750         679         899           Mean         550         750         678         827           SD         0         0         0         67           Minimum         518         756         678         702           Maximum         529         761         679         901           Mean         525         760         678         830           SD         5         2         0         66           Minimum         -23         4         0         3           Maximum         -12         9         0         2           Mean         -16         8         0         2           SD         5         2         0         0	Minimum         550         750         678         699         129           Maximum         550         750         679         899         149           Mean         550         750         678         827         140           SD         0         0         0         67         7           Minimum         518         756         678         702         131           Maximum         529         761         679         901         152           Mean         525         760         678         830         143           SD         5         2         0         66         8           Minimum         -23         4         0         3         2           Maximum         -12         9         0         2         4           Mean         -16         8         0         2         3           SD         5         2         0         0         0

FWHM – full width half maximum; SD – standard deviation.

Table 2. Statistics of the 680 nm chlorophyll absorption feature parameters obtained with the continuum removal using adjusted continuum channels. Data are presented for each of the treatments: control (CTR), plants contaminated with diesel (DSL) and plants contaminated with gasoline (GSL).

		Left channel	Right channel	Center	Depth	FWHM	Area
CTR	Minimum	518	757	678	823	141	108
	Maximum	528	761	679	909	154	132
	Mean	523	760	679	876	148	122
	Range	10	4	1	86	13	24
	SD	4	2	0	23	4	7
DSL	Minimum	518	761	678	680	129	83
	Maximum	530	762	679	898	152	129
	Mean	525	761	678	835	142	112
	Range	12	1	1	218	24	46
	SD	5	0	0	73	9	16
GSL	Minimum	518	750	678	605	122	69
	Maximum	530	761	678	896	151	127
	Mean	526	758	678	779	137	101
	Range	12	11	0	291	28	58
	SD	5	4	0	103	10	21

FWHM – full width half maximum; SD – standard deviation.

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