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Spectral characteristics of deforestation fires in NOAA/AVHRR images

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Abstract. This work presents optical-spectral and radiometric characteristics of fires associated to tropical deforestation as recorded by full resolution AVHRR/NOAA-9 images in the Amazon region during a dry season. Results showed that fires and smoke clouds were spectrally distinct and easily separated from surrounding ground covers by automatic digital processing. Channel 3 (3.55 to $3.93 \, \mu \text{m}$) was the most appropriate to identify active fires whose pixels had digital counts about one order of magnitude higher than common ground covers.

1. Introduction

The use of the AVHRR (Advanced Very High Resolution Radiometer) on-board satellites of the NOAA-series (National Oceanic and Atmospheric Administration) to detect smoke plumes was first reported by Ernst and Matson (1977). They detected forest fire plumes on NOAA-5 images that originated in Canada and spread over the Bering Strait. Dozier (1981), Matson and Dozier (1981) and Matson et al. (1984) demonstrated that channel 3 (3.55 to 3.93 µm) of the NOAA polar orbiters could be used to detect forest fires over extensive regions. They also proposed that sizes of fires and even their temperatures could be obtained combining channels 3 and 4 (10·3–11·3 μ m) if the AVHRR pixels were not saturated. Chung and Le (1984) used NOAA-7 imagery to identify forest fire plumes in West Canada in 1981, which were advected for 3000 km or even 5000 km over east North America, and covered areas over $1.2 \times 10^6 \,\mathrm{km}^2$. Svejkovsky (1985) detected in channel 1 (0.55 to 0.68 $\mu\mathrm{m}$) and 2 (0.75 to 1.1 μm) of NOAA-6 images large smoke clouds possibly associated with large forest fires in California, some 1100 km away. Flannigan (1985) and Flannigan and Haar (1986) detected forest fires in Alberta, Canada, also with NOAA satellites and stressed the low cost and satisfactory spatial and temporal resolution of the technique. Malingreau (1984) and Malingreau et al. (1985) used NOAA-7 images to detect and map forest fires in Indonesia and Borneo in 1982-83, and showed that 'vegetation indexes' obtained through AVHRR channels 1 and 2 can be used to evaluate the extension and damage of the fires. Muirhead and Cracknell (1985) were able to detect with channel 3 of AVHRR 300-400 fires from straw and stubble burning in Great Britain. Fires near Manaus, in the Brazilian Amazonia, have been located by Matson and Holben (1987) with the same technique, and they suggested the use of AVHRR data to monitor fires on a global scale. Examples of fire detection in many parts of the world are found in Matson et al. (1987). AVHRR data was also used to assess the extensive fires in the Yellowstone Park (EOSAT 1988).

More recently, another example of AVHRR algorithm to detect fires was proposed by Lee and Tag (1990), and an extensive review of orbital remote sensing detection of fire was done by Robinson (1991). Concerning effects of biomass burning in the atmosphere (Crutzen and Andreae 1990), AVHRR has also started to play a significant role. Andreae *et al.* (1988) were able to show that haze layers over Amazonia originated from deforestation fires detected by AVHRR. Kirchhoff *et al.* (1989) related the seasonality of ground measurements of ozone concentrations in Central Brazil to emissions from biomass burning detected in AVHRR channel 3, and Setzer *et al.* (1991) related the number of fires in channel 3 to tropospheric ozone variations measured in an aeroplane during the 'burning season' of Brazil. The amazing amount of such fires, of more than 350,000 in the dry year of 1987, has been estimated with AVHRR (Setzer and Pereira 1991a). Kaufman *et al.* (1990) discussed more techniques to estimate emissions from biomass burning in Amazonia based on AVHRR images also for 1987.

The objective of the present work was to determine optical-spectral and radiometric characteristics of fires associated to tropical deforestation in Brazil as registered by the AVHRR imaging instrument of the NOAA-series satellites. These fires do not occur naturally in the Amazon forest, and they only burn what was cut a few months before and let dry. Information about such fires is needed considering alarming rates of forest conversion in the tropics and the urgency to detect and monitor deforestation, fires and their emissions. Operational programmes to detect fires already exist (Setzer and Pereira 1991b) or are being proposed (Frederiksen et al. 1990, Malingreau 1990) and spectral studies of the targets will certainly improve the methods in use or under consideration.

2. Materials

Full spatial resolution Advanced Very High Resolution Radiometer (AVHRR) images on channels 1, 2 and 3 from the NOAA-9 Sun-synchronous satellite (Kidwell 1985) were recorded from 26 July to 9 August 1985, at the HRPT (High Resolution Picture Transmission) tracking and receiving station of the Brazilian National Institute for Space Research (INPE) located at Cachoeira Paulista, SP (Lat 22°40′S Long 45°01′W), see table 1.

Date 19 July		Equatorial crossing			
	Orbit no.	Hour, GMT	Longitude		
	3094	18 h18′43″	57·62°W		
20 July	3108	18 h07′55″	54·91°W		
21 July	3122	17 h57′06″	52·19°W		
26 July	3193	18 h45′09″	64·15°W		
27 July	3207	18 h34'20"	61·04°W		
29 July	3235	18 h12′43″	55·96°W		
31 July	3263	17 h51′06″	50·52°W		
5 August	3334	18 h38′06″	65·61°W		
6 August	3348	18 h28′11″	57·79°W		
7 August	3362	18 h17'22"	57·07°W		
9 August	3390	17 h55′45″	51·64°W		

Table 1. NOAA-9/AVHRR images of 1985 used in the study.

Picture element (pixel) sizes vary from the nominal nadir resolution of 1·1 km by 1.1 km to a maximum of about 2.4 km by 6.9 km at the off-nadir border of the image, when the scan angle reaches the maximum of 55.4° for the 1024th pixel. The channels recorded covered the optical spectrum in the $0.58-0.68 \mu m$ (visible light), $0.72-1.1 \,\mu m$ (near-infrared) and 3.55 to $3.93 \,\mu m$ (medium-infrared). Digital recording was made using only the eight most significant bits out the ten existing in the radiometric resolution. Channel 4 (10·3 to 11·3 μ m) and 5 (11·5 to 12·4 μ m) were not recorded due to technical limitations of the station at that time. The information in these channels is probably not relevant for this study since they detect little energy from fires as pointed by Matson et al. (1984), and also because detection of regular clouds is possible also in channel 2. A strip of 100 pixels on each border of the images was disregarded to avoid analysis of highly geometrically distorted pixels. No atmospheric correction was made to account for different viewing angles of the AVHRR. The ascending orbit images used are listed in table 1 and were part of the images recorded for the fire detection programme of INPE (Setzer and Pereira 1991 b). Full resolution image processing was carried out in an 'Image-100' ('I-100') multi-spectral image analyser (GE 1975). The images were analysed in sectors of 512 by 512 pixels to match the I-100 maximum resolution and avoid sampling or repetition of pixels in the digital processing. The softwares used were 'histogram' to obtain distribution of digital counts, 'cluster synthesis' to allocate pixels in predetermined multi-spectral classes and the 'single cell' classifier to obtain statistics for classes of interest. 'Stretching' was used to produce enhanced images for visual interpretation and for photographing.

3. Results and discussion

Figure 1 shows digital counts in a scale of 256 levels for pixels in three AVHRR channels for a region near Carajas, PA, as registered in the 7 August image. The area limited by the continuous line in the centre corresponds to a site burning when the image was obtained; this area is also shown in the pair of pictures in figure 2, at about 9° S and 50·75° W. The evidence considered to associate active fires to this area was the presence of smoke in channels 1 and 2 originating from the same area. This same evidence was found for all other areas classified as burning sites. The digital counts for the hot or 'fire pixels' in thermal channel 3, from 1 to 12 (1 corresponding to the hottest possible temperature), are about one order of magnitude smaller than surrounding pixels associated to vegetation, with counts up to 149. Counts between 39 and about 100 possibly correspond to areas already burned or starting to burn at the time the image was acquired.

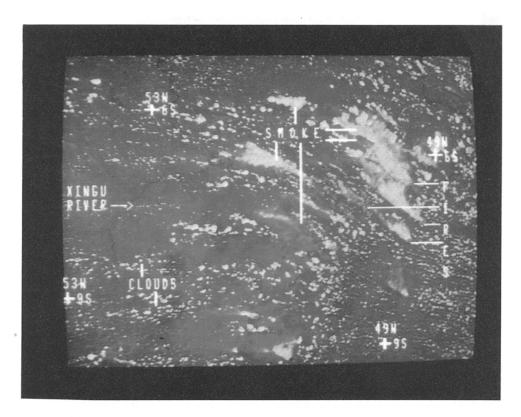
In channels 1 and 2 the pixels in the site can also be distinguished from the surrounding pixels, but not as evidently as in channel 3. In channel 2 pixels in the burning site, not covered by too much smoke, had counts between 30-37, only about 20 per cent less than pixels in the surrounding areas. Pixels covered by dense smoke had counts of 50-78 inside the site, and up to 126 to the west of the site, and therefore above the counts of the vegetation. Correspondingly, for channel 1 the values were 30-35, or 25 per cent higher for pixels with not much smoke, 45-81 for pixels with smoke in the site and up to 134 outside the site.

The above situation results largely from the high emission of energy by fires and by the transparency of smoke and of the atmosphere in the wavelengths of channel 3 in comparison to channels 1 and 2. As calculated by Robinson (1991), fires between 825-1000 K have the peak of spectral emission from $3.5-2.9 \mu\text{m}$, with an energy

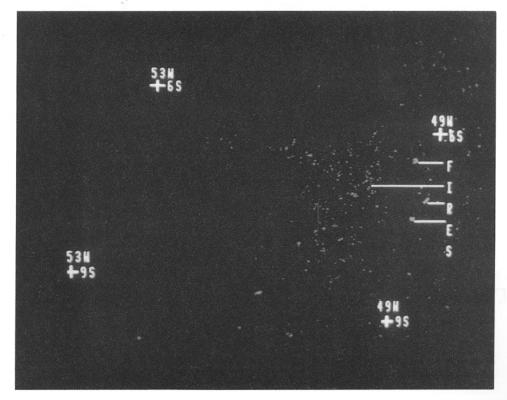
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CHANNEL
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54 49 45 43 32 42 43 33
           51 54 89 85 65
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                                 33 38 29
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                                                24
58 68 81
           59 66 112 121 103
                              69
                                 92 104
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72 110 110
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              75 117 130
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CHANNEL
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                             46 42
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                                        40 40 40 47
                              52 43 47
                                        42
                                             38 40 44
 55 63 77 55 58 87 84
                          69
 66 102 104 59 64 105 115
                          99
                             70 91 102
                                         57
                                             4.1
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                                             39 40
 96 126 100 62 71 110 121
                          87
                                  87 55
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                      71
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 76 98
       77 74 60 65
                          48
                              42
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       58 65 56 68
                       73
                          50 53
                                  57
                                     34
                                         34
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 62 66
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 38 39
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           44 41 39 39 41 44
CHANNEL
137 144 149 147 136 120 123 127 119 122 135 133 133 131 124 129 136
133 118 102 136 116 82 94 96 117 122 120 127 132 126 124 132 121
                                     77 109 104 85 105 135 135
120 80 93 135 115 84 83 103 109 67
                                             8 42 124 133 132
 94 85 111 130 109 89 91
                          97
                              67
                                  39 8
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112 107 126 106 108 109 129
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121 130 128 111 105 78 5
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134 133 122 133 93
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115 122 133 116
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                    47 102
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                                         97 90 109 132 132 132
109 107 109 110 97 99 91 85 86 94 113 122 130 137 132 130 134
117 101 96 100 93 97 87 75 84 106 123 125 127 127 126 132 130
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Figure 1. Digital counts for hot (fire) pixels in AVHRR channels 1, 2 and 3 on the NOAA-9 image of 7 August 1985. The area limited by the continuous line is a site burning.

Figure 2(a) Colour composition of AVHRR channels 1, 2 and 3 for geometrically uncorrected NOAA-9 image of 7 August 1985 showing active fires, smoke clouds and fair-weather cumulus clouds. (b) Digital classification of AVHRR channel 3 showing hot (fire) pixels for the same region shown in figure 2(a). Only pixels with digital counts from 1 to 8 are shown.



(a)



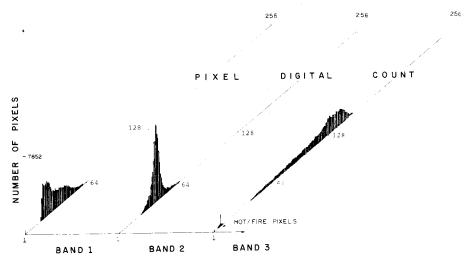


Figure 3. Histogram of pixel distribution in three AVHRR channels for 512 by 512 pixels of the NOAA-9 image of 9 August 1985. Note isolated peak in channel 3 associated to hot (fire) pixels.

amplification over the background of 3900–8900 times. For AVHRR channel 4 $(10\cdot3-11\cdot3\,\mu\text{m})$, not used in this study, and also according to Robinson (1991) the amplification over the background is 25–37 times, much lower than in channel 3. Channels 1 and 2 proved to be highly susceptible to smoke emissions which are unavoidable in forest fires, and therefore impair the use of these channels in fire detection.

Figure 3 shows the histograms for the digital counts in channels 1, 2 and 3 for a region of 512 by 512 pixels in South of Pará State, on 9 August. Of the three histograms, the one for channel 3 shows an isolated concentration of pixels with low counts and which were identified as hot/burning sites. The identification was possible with the help of the image in the visible channel depicting smoke plumes originating from the same pixels. Figure 4 shows a more detailed enlargement of the histogram for channel 3, in which the peak for count levels in the one to eight range associated to the fire pixels is clear.

Table 2 presents means and standard deviations for pixel counts in three channels for 2544 saturated pixels with count level one and for 14832 pixels in the one to eight count range. These pixels were all associated to active fires in the fourteen sectors of 512 by 512 pixels extracted from all images used in this study. Also in these sectors, the visible channel was used to confirm the fires by showing dense smoke clouds originating from all the pixels selected.

The column Δ shows the count level range of fire pixels for various sectors of the images analysed. When this range is either just one or one to eight for channel 3, the corresponding range for bands one and two refers to those same pixels of channel 3. The next two columns in the table show the means and variances of the ranges, and the n column shows the number of pixels in the sector of 512 by 512 pixels analysed in the three channels.

The data shows that fire pixels are better defined in channel 3 than in channels 1 and 2 when one considers the count range as well as the means and variances. Fire

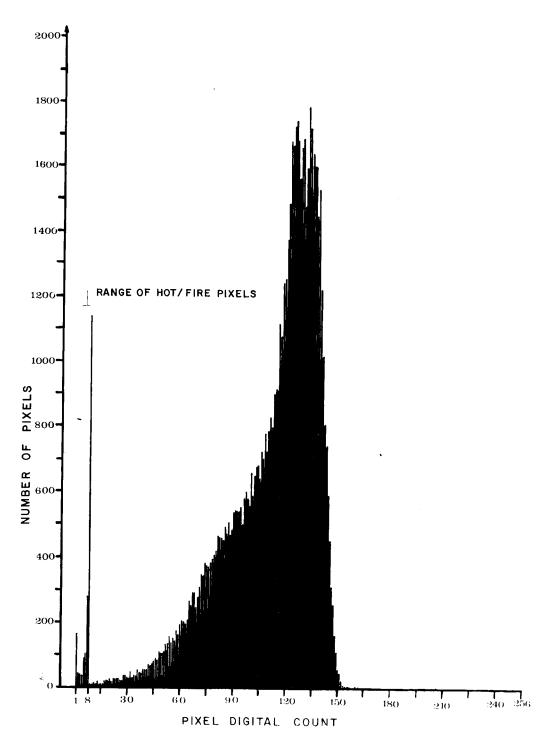


Figure 4. Detailed histogram of AVHRR channel 3 pixels shown in figure 3. Note that the peak related to hot (fire) pixels includes only 8 levels (in an 8-bit/256 scale) with higher frequency in the 8th level.

Table 2. Data and statistics of hot (fire) pixels, in AVHRR images. n is the number of hot (fire) pixels in the three channels; Δ , \bar{X} , S^2 , are respectively the ranges, averages and variances of the pixels in each range of digital counts.

				cs—1st cou channel 3	ınt			—8 initial channel 3	
Image date	Channel	Δ	\bar{X}	S ²	n	Δ	$ar{X}$	S^2	n
26 July	3 2 1	1 30–70 22–71	1·0 41·1 31·9	$ \begin{array}{c} 0.0 \\ 112.7 \\ 183.0 \end{array} $	22	1–8 26–97 20–100	6·1 36·7 30·4	6·8 86·4 140·2	166
	3 2 1	1 23–48 18–45	1·0 30·9 24·8	$ \begin{vmatrix} 0.0 \\ 35.0 \\ 34.5 \end{vmatrix} $	27	1–8 21–89 16–86	5·2 34·2 27·3	$ \begin{array}{c} 7.9 \\ 90.3 \\ 104.7 \end{array} $	133
29 July	3 2 1	1 15-71 14-71	1·0 35·4 27·6	$\left. \begin{array}{c} 0.0 \\ 120.7 \\ 166.2 \end{array} \right\}$	32	1–8 15–71 14–71	6·4 35·6 26·6	$6.7 \\ 89.5 \\ 128.7$	230
6 August	3 2 1	1 31–100 21–98	1·0 47·7 42·0	$ \left.\begin{array}{c} 0.0 \\ 250.5 \\ 371.0 \end{array}\right\} $	54	1–8 23–119 18–122	6·3 48·9 43·4	$ \begin{array}{c} 5.8 \\ 249.9 \\ 367.1 \end{array} $	511
7 August	3 2 1	1 24–72 16–79	1·0 36·8 29·3	$ \begin{array}{c} 0.0 \\ 96.2 \\ 131.4 \end{array} $	98	1-8 24-72 16-79	6·6 36·9 28·6	$ \begin{array}{c} 5.5 \\ 53.7 \\ 99.2 \end{array} $	985
	3 2 1	1 17–128 17–125	1·0 45·7 39·5	$ \begin{bmatrix} 0.0 \\ 212.3 \\ 290.6 \end{bmatrix} $	120	1-8 17-128 17-125	6·3 45·3 40·5	$ \begin{array}{c} 6.0 \\ 170.7 \\ 251.2 \end{array} $	1051
9 August	3 2 1	1 23–112 20–107	1·0 38·4 32·1	$ \begin{array}{c} 0.0 \\ 70.1 \\ 90.2 \end{array} $	1020	1-8 17-123 16-127	5·3 39·2 34·3	$ \begin{array}{c} 8.1 \\ 91.6 \\ 139.2 \end{array} $	4641
	3 2 1	1 19–82 18–88	1·0 41·2 36·1	$ \begin{array}{c} 0.0 \\ 195.9 \\ 305.4 \end{array} $	32	1–8 19–82 18–88	6·8 39·5 32·9	$ \begin{array}{c} 5.0 \\ 115.9 \\ 188.4 \end{array} $	386
	3 2 1	1 23–82 19–88	1·0 41·4 36·3	$ \begin{bmatrix} 0.0 \\ 131.9 \\ 239.4 \end{bmatrix} $	74	1-8 19-88 17-91 1-8	6·8 39·3 33·8 6·5	$ \begin{array}{c} 4.9 \\ 93.7 \\ 173.4 \end{array} $	877
	3 2 1	1 27–122 22–125	1·0 68·8 64·5	$ \begin{array}{c} 0.0 \\ 1386.8 \\ 1830.0 \end{array} $	22	20–125 19–128 1–8	48·5 41·4 6·7	662·4 851·8 4·6	184
	3 2 1	1 29–100 2–105	1·0 41·1 37·9	$ \begin{array}{c} 0.0 \\ 129.5 \\ 192.8 \end{array} $	54	22–123 17–127	40·1 37·8 5·0	$ \begin{array}{c} 4.6 \\ 72.3 \\ 128.3 \end{array} $	729
	3 2 1	1 22–103 20–109	1·0 41·0 33·8	$ \begin{array}{c} 0.0 \\ 54.5 \\ 76.5 \end{array} $	765	1-8 17-114 16-119	3·0 40·9 34·3 6·7	$ \begin{array}{c} 8.4 \\ 76.2 \\ 123.9 \end{array} $	3061
	3 2 1	1 21–82 19–88	1·0 39·9 34·6	$ \begin{vmatrix} 0.0 \\ 111.1 \\ 205.0 \end{vmatrix} $	79	1-8 19-88 16-91 1-8	38·5 33·1 6·0	89·5 165·9 6·8	924
	3 2 1	1 16–98 16–107	1·0 33·0 30·4	155·9 178·4	145	17–98 16–103	38·0 34·2	$ \begin{array}{c} 0.8 \\ 92.7 \\ 152.5 \end{array} $	954

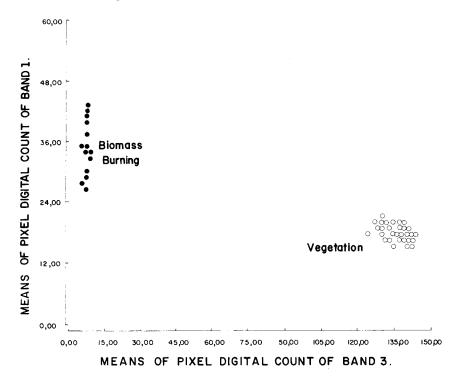


Figure 5. AVHRR channels 1 and 3 bi-spectral distribution of active fires and vegetation. Each of the 14 fire and 30 vegetation dots actually represent averages for the sectors given in tables 1 and 2.

pixels presented mean counts between 5·2 (26 July) and 6·8 (9 August) with a maximum variance of 8·4 (9 August) when using the one to eight count limit. Ranges for the other channels were much wider and consequently variances were also higher, indicating that channel 3 provides a much more defined range to detect hot pixels. For channel 1, the means in the column with statistics for the eight initial counts (in channel 3) varied from 26·6 (29 July) to 43·4 (6 August). The variances, in the same column of statistics, varied from 99·2 (7 August) to 851·9 (9 August).

The wider variances and ranges of count values of fire pixels in channels 1 and 2 can be explained by the effect of the smoke produced by the fires and by differences in ground covers. The smoke increases the reflection of incoming solar radiation and also diffuses the outgoing radiation reflected by the different ground covers. Concerning ground covers, the areas burning at the time the satellite images were obtained naturally had different amounts of exposed soil and content of ashes, reflecting more solar radiation, and therefore increasing the range in the count values in these two channels.

Figure 5 shows on a bi-spectral graph for channels 1 and 3 that fire and vegetation pixels are well separated without possibility of confusion. Each point in the graph is actually the average of many samples obtained from the eleven images already listed in table 1. Details of the vegetation samples plotted in figure 5 are given in table 3, and were always from dense tropical forest areas and less polluted by smoke; the points for biomass burning represent the average counts of the hot

Table 3. Data and statistics for samples of vegetation pixels in AVHRR images. n is the number of pixels in the three channels. Δ , \bar{X} , S^2 , are respectively the ranges, averages and variances of the pixels. The 'total' column refers to all samples in each image combined.

Image date	Channel	Radiometric range	Mean	S ²	n	Total mean	N
19 July	1 2 3	15–18 32–37 129–144	15·1 34·3 140·2	$\begin{bmatrix} 0 \cdot 1 \\ 0 \cdot 6 \\ 2 \cdot 0 \end{bmatrix}$	2100		
	1 2 3	19–21 40–44 136–143	19·6 42·1 138·8	$ \begin{array}{c} 0.3 \\ 0.6 \\ 1.8 \end{array} $	100	15·3 34·7 140·1	2200
20 July	1 2 3	16–26 39–47 120–143	16·6 40·4 140·3	$ \begin{bmatrix} 3 \cdot 3 \\ 2 \cdot 1 \\ 15 \cdot 4 \end{bmatrix} $	36		
	1 2 3	18–18 39–47 120–143	18·0 41·4 136·0	$ \begin{bmatrix} 0.0 \\ 0.7 \\ 3.7 \end{bmatrix} $	884	18·0 41·4 136·1	920
21 July	1 2 3	16–18 35–40 134–139	16·7 38·0 136·4	$\left. egin{array}{c} 0 \cdot 2 \\ 1 \cdot 0 \\ 1 \cdot 0 \end{array} \right\}$	196		
	1 2 3	15-16 33-38 135-148	15·2 35·4 141·3	$ \begin{array}{c} 0.1 \\ 0.8 \\ 2.7 \end{array} $	836		
	1 2 3	15–16 34–37 137–147	15·3 35·4 140·2	$\begin{bmatrix} 0.2 \\ - \end{bmatrix}$	100	15·5 35·9 140·3	1132
26 July	1 2 3	19–20 40–44 137–141	19·0 42·2 138·7	$\begin{pmatrix} 0.1\\0.8\\0.6 \end{pmatrix}$	100		
	1 2 3	19-20 41-46 135-141	19·4 42·9 138·3	$ \begin{bmatrix} 0.2 \\ 0.7 \\ 1.2 \end{bmatrix} $	140	10.0	
	1 2 3	20–20 43–45 135–139	20·0 44·2 136·8	$\begin{bmatrix} 0.0 \\ 0.3 \\ 1.0 \end{bmatrix}$	36	19·3 1·0 138·3	276
27 July	1 2 3	19–20 41–46 133–140	20·0 43·1 136·7	$ \begin{pmatrix} 0.0 \\ 0.7 \\ 1.5 \end{pmatrix} $	324		
	1 2 3	19–20 42–45 133–139	19·0 42·9 136·3	$ \begin{vmatrix} 0.0 \\ 0.6 \\ 1.3 \end{vmatrix} $	220	40.4	
	1 2 3	17–20 42–46 133–140	18·9 43·9 136·2	$ \begin{pmatrix} 0.3 \\ 0.9 \\ 2.3 \end{pmatrix} $	60	19·5 43·1 136·5	604
29 July	1 2 3	17–18 40–43 129–134	17·3 41·3 131·6	$\begin{pmatrix} 0.2\\0.4\\1.2 \end{pmatrix}$	100		
	1 2 3	17–20 38–48 125–143	17·3 42·7 135·8	$ \begin{pmatrix} 0.2 \\ 2.5 \\ 7.4 \end{pmatrix} $	748	17·3 42·6 135·0	848

Table 3 continued

Image date	Channel	Radiometric range	Mean	S ²	n	Total mean	N
31 July	1	16–18	16.6	0.3	100		
	2 3	36–39 133–138	37·6 135·0	0.3	100		
	1	16–19	17.4	0.4			
	2	32–40	38.2	1.6	60		
	3	111–141	138.8	31.0			
	1 2	17–18 36–39	17·1 37·9	$\begin{pmatrix} 0.1 \\ 0.8 \end{pmatrix}$	60		
	3	136–141	138.8	1.7 ∫	00		
	1	16–17	16.0	0.0			
	2	35–39	36.6	0.9 }	100		
	3	129–141	133.5	5.0			
	1	16–21	16·7	0.9	140	16·7	
	2 3	32–42 126–143	36·2 138·4	$\begin{array}{c} 2\cdot 4 \\ 8\cdot 1 \end{array}$	140	37·0 135·8	460
5 August	1	17–17	17.0	0.0			
•	2	34-38	36.3	1.1 }	156		
	3	139–148	142.5	1.9 ∫			
	1	17–18	17·9	0.1	26		
	2 3	35–36 134–142	35⋅8 139⋅1	$\begin{array}{c} 0.1 \\ 2.4 \end{array}$	36		
	1	17–18	17.5	0.3			
	2	31–36	34.4	0.6 >	140		
	3	136–144	140.7	2.0			
	1	18–21	18.1	0.2	1.40		
	2 3	33–37 134–148	35·0 141·8	$\begin{array}{c} 0.2 \\ 2.8 \end{array}$	140		
	1	18–18	18.0	0.0)			
	2	34–35	35.0	0.0	84		
	3	140–148	142.9	— J			
	1	19–20	19·9	0.1	26		
	2 3	42–45 132–135	43·4 133·1	0·6 0·9	36		
	1	19–23	20.0	0.2		18-1	
	2 3	34–39	36.3	0.9 }	100	35.8	
	3	130–143	136-1	5.7		140.5	692
6 August	1	19–20	19.9	0.1			
	2 3	42-44	43.3	0.3	36		
	1	132–136 20–21	133·9 20·9	0·6 ∫ 0·1]			
	2	20–21 44–47	45.2	0.6	36		
	3	116–130	126-4	7.7	• •		
	1	19–23	19.9	0.8			
	2	40-47	43.3	1.8	484		
	1	129–144 20–23	137·3 20·5	6·7 ∫ 0·6 ∫			
	2	43–47	45·3	0.7	36		
	3	121–129	126.1	2.6			
	1	20–23	21.1	0.2			
	2	43–46	44.8	0.6	60		
	3	125–133	128-3	2⋅2 ∫			

Table 3 continued

Image date	Channel	Radiometric range	Mean	S ²	n	Total mean	N
	1	20–21	20.7	0.2		20.2	
	2 3	44-46	45·1	0.3	36	43.7	600
	3	128–132	130-1	0.9		128.5	688
7 August	1	20-22	20.2	0.2			
	2 3	44–49	46.4	1.0	60		
	1	125–132 18–21	128·9 19·3	2.7			
	2	35–46	42·9	0.3 4.2	60		
	3	126–136	129.1	3.6 ∫	00		
	1	19–19	19.0	0.0 ∫			
	2	40-45	42.6	1.1 }	60		
	3	125–131	128.4	1.7 ∫			
	1	19-20	19.0	0.0	60		
	2 3	40–46 113–132	42·2 127·1	$\begin{array}{c} 1.0 \\ 12.2 \end{array}$	60		
	1	18-21	19.1	0.1			
	2	31–45	42.4	2.5	192		
	3	121-138	128.9				
	1	18-20	18.6	0.3			
	2 3	35-41	38.1	0.8	684		
		127–136	133.2	2.2			
	1 2	18-19 37-42	18·4 38·3	$0.2 \\ 0.7$	180		
	3	130–139	135.5	3⋅3 ∫	100		
	1	16–19	17.2	0.2		18.0	
	2	34-43	37.3	2·1 }	1140	38.6	
	3	120–143	137-2	7.2		134.4	2436
9 August	1	16–22	17.7	0.4			
Č	2	36-41	37.7	0.8 }	140		
	3	117–141	133.8	6.8			
	1	18–19	18.4	0.2			
	2 3	35–38 123–134	37·2 128·9	0.6 \rightarrow 5.3	100		
	1	19-21	128.9	0·2]			
	2	19–21 34–49	43·2	5.6	36		
	3	128–138	131.5	4.1 ∫	50		
	1	18–19	18.2	0.2			
	2	42-44	42.5	0.5 }	60		
	. 3	114–127	123.2	4.2			
	1	18-19	18.0	0.0	1.40	18.2	
	2 3	35–39 114–140	37·8	0.5	140	41·5 126·4	1496
	<u></u>	114-140	134.0	1.27		120.4	1490

pixels in the one to eight range from table 2. Vegetation samples in channel 3 had low average values of counts, ranging from 123·2 (9 August) to 142·9 (5 August), and were more than one order of magnitude higher than the biomass burning pixel counts. (It must be remembered that channel 3 has an inverted scale, where the

Table 4. AVHRR response in channels 1, 2 and 3 for active fires, smoke and vegetation. Values represent averages obtained from many sectors and images referenced in tables 1, 2 and 3. Intervals of confidence refer to the significance level of 1 per cent (α=0.01).
 Channel Fire Forest Smoke

Channel	Fire	Forest	Smoke
1	34 ± 34	17+1	39±8
2	40 ± 28	38 ± 3	44 ± 5
3	$\overset{-}{6\pm}7$	137 ± 5	136 + 31

lowest count values correspond to highest energy levels received by the AVHRR sensor.) The difference between counts of fire and vegetation pixels in channel 2 did not exist, since in this channel average counts of pixels ranged from 34·2 (26 July) to 48·9 (6 August) for fire pixels (table 2), and from 34·3 (19 July) to 46·4 (7 August) for forest pixels (table 3). For channel 1, the counts varied from 26·6 (29 July) to 43·4 (6 August) for fire pixels (table 2), and from 15·1 (19 July) to 21·1 (6 August) for forest pixels, making the difference in this channel barely marginal to separate these two classes. Therefore fires are better distinguished from surrounding forest in channel 3, and to some extent also in channel 1. With the presence of significant amounts of smoke, channel 1 will also record reflected radiation from the smoke particles, preventing the recording of good data of the forest cover, and consequently making its use unreliable for fire detection in typical conditions of biomass burning in the forest.

The above information can be summarized in table 4, where average count values for all samples of fire and forest pixels combined are presented. Average data of samples of pixels on downwind dense smoke plumes over forest background has also been included; for more details about the characteristics of this class (smoke) see Pereira (1988). In channel 3, forest and smoke had close responses, indicating that in the $3.7 \, \mu \text{m}$ wavelength the smoke does not show high temperatures and that it can be penetrated to a large extent. In channel 2 the three classes had responses relatively close, again indicating that this channel is not appropriate to fire detection. In channel 1 smoke had higher count levels than forests and to some extent than fires, corroborating the likelihood that it reflects incoming solar radiation, and therefore that it interferes in the detection of fires in real biomass burning conditions.

4. Conclusions

Digital analysis of channels 1, 2 and 3 of NOAA-9 AVHRR images indicated that channel 3 $(3.55-3.93 \,\mu\text{m})$ is the best one to detect active fires in a region of tropical forests. Channels 1 and 2 are subject to effects of smoke and cause the fires to be mistaken with other ground covers. Channel 3 showed pixels with digital counts of more than one order of magnitude smaller than for other ground covers. Most fires were found in the 8th count (in 256 levels, or 32nd on 1024 levels) and not in the saturated level. Data about biomass burning in tropical forests is becoming increasingly important to study the carbon cycle and atmospheric contamination in general. The simple technique to detect fires based on AVHRR/HRPT channel 3, and the relatively low costs of image reception and processing presents therefore a strong potential to assess occurrences of fires in near-real time.

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