

# Geological and Geobotanical Studies of Long Valley Caldera, CA, USA, Utilizing New 5m Hyperspectral Imagery

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# Geological and Geobotanical Studies of Long Valley Caldera, CA, USA Utilizing New 5m Hyperspectral Imagery

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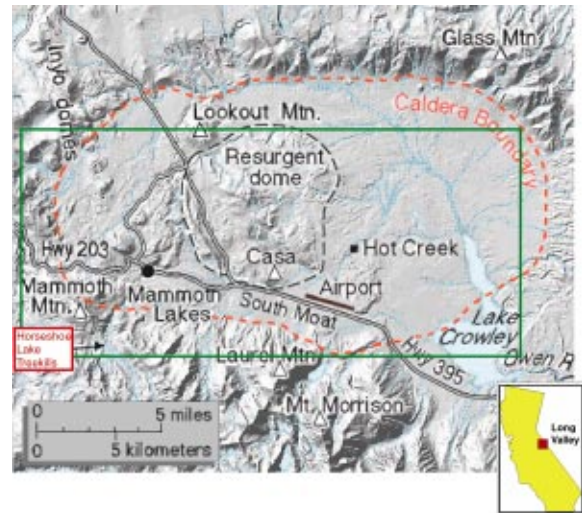
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## INTRODUCTION

In May of 1989, a six month-long small magnitude earthquake swarm began beneath the Pleistocene-aged dacitic cumulovolcano Mammoth Mountain. The following year, increased mortality of trees in the Horseshoe Lake region was observed. Their deaths were initially attributed to the Sierran drought of the 1980's. In 1994 however, soil gas measurements made by the USGS confirmed that the kills were due to asphyxiation of the vegetation via the presence of 30-96 % CO<sub>2</sub> in ground around the volcano[1]. Physiological changes in vegetation due to negative inputs into the ecological system such as anomalously high levels of magmatic CO<sub>2</sub>, can be seen spectrally. With this phenomena in mind, as well as many other unanswered geological and geobotanical questions, seven lines of hyperspectral 5-meter HyMap data were flown over Long Valley Caldera located in eastern California on September 7, 1999, (see Fig. 1). HyMap imagery provides the impetus to address geobotanical questions such as where the treekills are currently located at Mammoth and other locales around the caldera as well as whether *incipient* kills can be identified. The study site of the Horseshoe Lake treekills serves as a focus to the initial analyses of this extensive HyMap dataset due to both the treekill's geologically compelling origins and its status as a serious volcanic geohazard.

## BACKGROUND AND SETTING

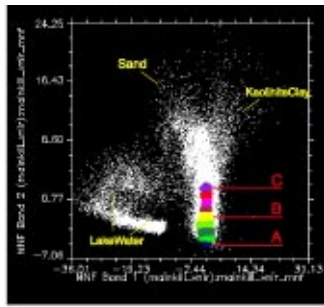
Mammoth Mountain sits on the western rim of the much larger Long Valley caldera which formed 760,000 years ago in one of the most violent eruptions in earth history, expelling over 600 km<sup>3</sup> of ash and lava. It is one of three active calderas within the contiguous United States. The most recent eruptive activity in the Long Valley region occurred along the north-south trending Mono-Inyo volcanic chain in the western part of the caldera. Eruptions as young as ~600 yrs. have occurred as part of this system, including on the northern flanks of Mammoth Mtn. The past twenty years have witnessed not only the previously mentioned localized volcanic degassing, but also increased seismic activity throughout the caldera beginning with four magnitude ~6.0 events in 1980. Re-inflation of the caldera's resurgent dome totals almost a meter since 1980 [2]. As a restless caldera,



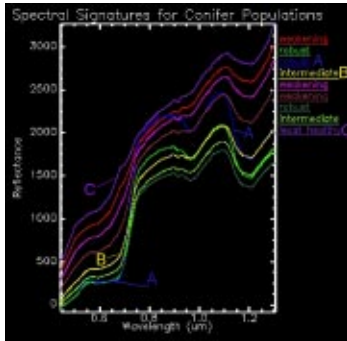
**Figure 1. Index map of study region. Green box indicates boundaries of 1999 HyMap acquisition. Modified from USGS LVO website <http://quake.wr.usgs.gov/VOLCANOES/LongValley/>**

Long Valley has garnered abundant research and monitoring efforts, including whole suites of geophysical and geochemical analyses and studies. These efforts have culminated in the recent inception of the USGS's Long Valley Observatory in 1999. However, few remote sensing studies have been completed at this caldera, though Advanced Visible Infrared Imaging Spectrometer (AVIRIS) work by both de Jong in 1996 and Hausback and others in 1998 suggested initial success at mapping tree mortality in the vicinity of Mammoth Mtn.[3][4].

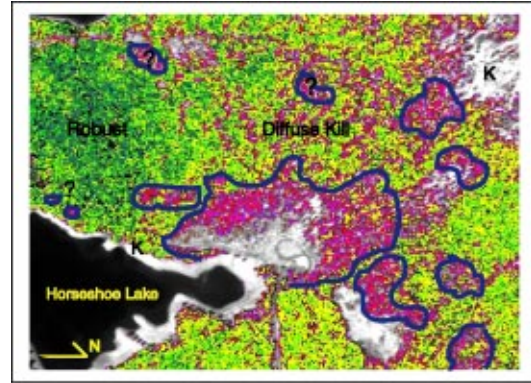
The Horseshoe Lake kill lies on the southern flank of Mammoth Mtn and is characterized by Quaternary andesites, dacites and glacial tills. The main kill mapped in this study lies exclusively on till. The dominant tree species found in the Horseshoe Lake region is *Pinus contorta* (Lodgepole Pine). Other species include *Abies magnifica* (Red Fir), *Tsuga mertensiana* (Mountain Hemlock), and *Pinus albicaulis* (Whitebark Pine). Flux from the Horseshoe Lake treekill region has declined from 350 tons/day in 1995 to 90 tons/day in 1998 [5]. The kill locations coincide with mapped faults. CO<sub>2</sub> is thought to travel up along these faults from a semi-sealed low temperature gas reservoir that caps a much hotter liquid reservoir, and then spreads out into the soil near the surface [6].



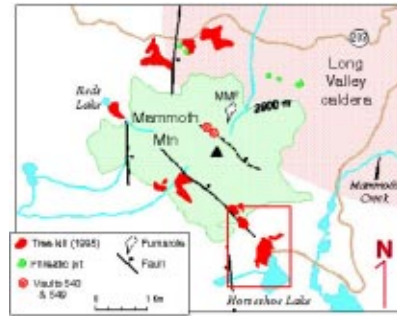
A



B



C



D

**Figure 2.. Analysis of Horseshoe Lake treekill image subset. Fig. 2a shows the correlation between MNF Band 1 and 2. Letters coincide with letters shown in Fig. 2b. These spectra are means from the data shown in Fig. 2a. Fig. 2c shows spectrally mapped treekills. Kills with question marks indicate regions previously unmapped by more traditional methods. The letter K indicates concentrations of kaolinite, found predominately along faults. Fig. 2d is taken from the USGS LVO (Long Valley Observatory) website <http://quake.wr.usgs.gov/VOLCANOES/LongValley/> and shows locations of tree kills mapped by previous workers. The red square shows location of image analysis in Fig. 2c.**

Within the visible and near-infrared portions of the electromagnetic spectrum, absorptions due to pigments such as chlorophyll A and B contained within the leaves and needles of plants can change with respect to both positive and negative influences. In the case of the CO<sub>2</sub>-induced treekills around Mammoth, high levels of this gas causes asphyxiation of the organism which results in a breakdown of the metabolic processes and subsequently a loss in the chlorophyll absorption within the red wavelength region. This breakdown can be tracked spectrally.

#### DATA ACQUISITION AND ANALYSIS

The Australian HyMap sensor (Integrated Spectronics Ltd.) acquired images of the caldera at a five-meter spatial resolution with 126 bands across a spectral range of 450-2500 nm with bandwidths ranging from 10-20 nm. This whiskbroom scanner has a reported signal to noise ratio of greater than 1000:1. The sensor itself was flown in a twin-engine Cessna with complete radiometric and spectral calibration on-board as well as simultaneous DGPS data acquisition used in image calibration and georectification.

This dataset was acquired as part of a group shoot that included several other U.S. governmental, educational, and commercial entities and was organized and administered by

Analytical Imaging and Geophysics (AIG) in Boulder, CO, USA and the HyVista Corporation in Sydney, AUS.

Analysis of this imagery was performed in the software package ENVI (Environment for Visualizing Images). The data was received atmospherically corrected via the ATREM (Atmospheric Removal) algorithm [6]. Further spectral smoothing of the data was performed with the EFFORT (Empirical Flat Field Optimal Reflectance Transformation) algorithm [7] by AIG. Unfortunately, same-day ground calibration was impossible, though some spectral measurements were made four days later with an ASD (Analytical Spectral Device) spectrometer.

In order to more efficiently analyze the huge files of these HyMap datacubes, we performed spatial subsetting by focusing on particular regions such as the Horseshoe Lake treekill. The data is then spectrally subset in two ways. In preparation for a principle components like algorithm called the Minimum Noise Fraction (MNF) contained within ENVI, the data cube is divided into two spectral chunks; a visible-near infrared (VNIR) chunk (0.45-1.34 um) and a shortwave infrared (SWIR) chunk (1.39-2.50 um). The MNF algorithm contained within ENVI is then applied to each spectral chunk separately. The MNF is a two-step algorithm. The noise in the data is first whitened resulting in uncorrelated noise in every band and unit variance. Secondly, the data is treated to

a standard principal components transform resulting in a set of new n-dimensional axes [8]. As we are only interested in those bands with the most signal and coherence, those bands containing mostly noise can be removed from further processing. The image subset presented in this paper produced approximately 20-22 coherent MNF bands.

Data analysis presented in this work ends with the study of the correlation between the first two MNF bands, or those bands that have the most signal and coherence, as well as contrast to each other. Figure 2a shows MNF Band 1 on the x-axis plotted against MNF Band 2 on the y-axis. The spread of data nicely represents the major spectral populations of materials. By analyzing the correlation of Band 1 and Band 2 within the spectral tree population, we discriminated important classes of tree physiological condition as shown by the spectral signatures in Figure 2b. We then used these signatures to create the map seen in Figure 2c.

## RESULTS AND CONCLUSIONS

Analysis of the MNF Band 1 and 2 correlation allows us to discriminate populations of trees due to their relative physiological state. The loss in the chlorophyll absorption in the red wavelengths is readily seen in the conifer population spectral plot. The progression from robust populations (A) at the bottom of the MNF plot (Fig. 2a) to those populations at an intermediate physiological state (B) is seen spectrally by a loss in the chlorophyll absorption as well as an overall decrease in near-infrared reflectance (Fig. 2b). Population C illustrates the least healthy vegetation in the image. The loss of chlorophyll in these populations is due primarily to anomalously high levels of soil-CO<sub>2</sub>. However, many other factors can lead to loss of chlorophyll. In this region, sickness due to beetle infestations has been observed. Drought and heat can cause a loss of chlorophyll. In short, many conditions affecting a plant's metabolic system can lead to a loss of chlorophyll. *A priori* knowledge is therefore required to narrow the sources of morbidity upon vegetation populations.

Our previous work on vegetation signatures has indicated that often, the linear spectral mixing between a rock and vegetation specimen can mimic a loss in chlorophyll such as that seen in Fig. 2b. However, analysis of the longer wavelengths of these physiological spectral classes in the 2-2.5 um region indicated little evidence of rock-vegetation mixing. Populations such as C may have some mixing, especially as we approach that area of the MNF plot exemplifying clay and sand. The increased spatial resolution of HyMap (5m) over such imagery as AVIRIS (20m) has been valuable in geobotanical studies of the caldera because smaller pixels provide for less mixing and therefore more accurate classifications.

We successfully discriminated previously mapped treekill populations with the HyMap imagery as indicated in Fig. 2c and 2d. Most of the robust populations are located directly to the west of Horseshoe Lake. Past fieldwork suggests that the

diffuse treekill mapped to the west by HyMap is a real feature. We will ascertain the validity of this zone and other possible kills in the coming summer 2000 field season.

Future work with the treekill populations will include advanced processing techniques such as those used with clay alteration mapping in this region. Spectral endmembers of predominately kaolinite, alunite, and montmorillonite have been mapped along both known and previously unknown faults on the southern flanks of Mammoth Mtn. The inherent variability in vegetation has made such advanced processing more difficult, but the identification of both physiological state and species is possible.

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