

Comparison of Surface Reflectance Retrieved from Hyperspectral Data Using MODTRAN4 and CAM5S

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Abstract

The present investigation evaluates surface reflectance retrieved from Airborne Visible/Infrared Imaging Spectrometer (AVIRIS) and Compact Airborne Spectrographic Imager (casiTM) data using the CAM5S and MODTRAN4 atmospheric radiative transfer (RT) codes. The retrieved surface reflectances were compared with ground-based reflectances acquired with a GER3700TM spectroradiometer for a playa and canola target. The results showed that the best overall performance was achieved with MODTRAN4. Major differences occur in the stronger gas absorption regions. At wavelengths unaffected by strong gaseous absorption, the performance was similar for both RT codes even though CAM5S has an execution time that is about about 50 times faster than that of MODTRAN4.

Introduction

Surface reflectance retrieval in hyperspectral remote sensing is an important step in the data processing chain for the extraction of quantitative information in many applications areas. In order to calculate surface reflectance from remotely measured radiance, atmospheric radiative transfer (RT) codes play an important role for removal of the atmospheric scattering and gaseous effects (Conel et al., 1988; Teillet et al., 1991; Gao et al., 1993; Green et al., 1996; Richter, 1996; Staenz and Williams, 1997). Given the high volume and complexity of hyperspectral data, the surface reflectance retrieval results depend strongly on the selected RT code as well as on the radiometric and spectral calibration of the sensor (Staenz et al., 1994 and 1995; Secker et al., 2000).

This study concentrates on the evaluation of the surface reflectance retrieved with the RT codes CAM5S (Canadian Advanced Modified 5S; O'Neill et al., 1996) and MODTRAN4 (MODerate atmospheric radiance and TRANsmittance model; Berk et al., 1989 and 1999). These RT codes are applied to Airborne Visible/Infrared Imaging Spectrometer (AVIRIS) data as well as to Compact Airborne Spectrographic Imager

(casiTM) data. The retrieved surface reflectance is compared with simultaneously measured ground-based reflectances in order to assess the accuracy of different RT code procedures. Special emphasis is given to the gaseous absorption regions where the largest errors in the retrieval of surface reflectance occur. In addition, the trade-off between the accuracy and the RT code's computation time is discussed. The entire analysis was carried out on the Imaging Spectrometer Data Analysis System (ISDAS), an advanced hyperspectral analysis software system developed at the Canada Centre for Remote Sensing (Staenz et al., 1998).

Test Data Sets

Two hyperspectral data sets, acquired with AVIRIS and casiTM, respectively, were used for this study. Concurrent ground reference information was collected during the AVIRIS overpass. This included ground-based reflectance data, aerosol optical depth, and water vapour content. None of these data were available for the casi cube.

The AVIRIS data set was collected over the Railroad Valley playa in Nevada, U.S.A on June 17, 1998. AVIRIS acquires imagery at approximately 20 m ground resolution in 224 spectral bands, each about

10 nm wide, in the 400-nm to 2500-nm wavelength range (Vane et al., 1993). Concurrent ground information includes reflectance data acquired with a GER3700TM spectroradiometer from the playa and solar irradiance measurements with a Microtops-IITM sunphotometer for retrieval of aerosol optical depth at 550 nm and column water vapour. The playa target is located in flat terrain and covers a 100 m x 100 m homogeneous area. It is a relatively smooth surface of compacted clay-rich lacustrine deposits. Twenty measurements were averaged to derive a representative reflectance spectrum of this site. The target reflectances, derived with a SpectralonTM panel, were then corrected for the panel's reflectance and anisotropy and convolved to the AVIRIS bands. The co-location of ground and airborne data was achieved visually using road boundaries.

A *casti*TM data set acquired over an agricultural test site near Altona, Manitoba, Canada on July 25, 1996 was also used for this study. The data were collected in 96 contiguous, 6.8 nm wide spectral bands, sampled at 5.8 nm interval (Anger et al., 1996). In this data acquisition configuration, the swath consists of 304 pixels with a spatial resolution of 4 m across and 4 m along track at a flight altitude of about 2500 m above ground level. The wavelength range was set from 458 nm to 1000 nm.

Radiative Transfer Codes

The specific features of these models are given in Table 1 and are briefly summarized in the following paragraphs.

CAM5S (Version 1.0)

CAM5S is an improved version of the semi-analytical M5S (modified version of 5S used at the Canada Centre for Remote Sensing) code (Teillet and Santer, 1991) which is based on 5S (Tanré et al., 1990). M5S includes features such as terrain elevation and sensor altitude dependency and reverse mode computation for surface reflectance retrieval. The 6S features (Verote et al., 1994) such as non-lambertian (BRDF: bidirectional reflectance distribution function) calculations, computation of CO₂, CH₄, and NO₂ gaseous transmissions, and new aerosol model types have been incorporated into CAM5S. The spectral resolution was also improved to optionally run the code on a 2.5 nm or 10 cm⁻¹ grid, respectively. A single scattering scheme is used in CAM5S.

MODTRAN4 (Version 1.0)

This code is based on LOWTRAN7 (Kneizys et al., 1988). Major features incorporated into MODTRAN over the years include an increase in spectral resolution from 20 cm⁻¹ to 1 cm⁻¹, an improved multiple scattering algorithm (N-stream discrete ordinate method), and more accurate exo-atmospheric irradiance data bases (Berk et al., 1989 and 1999; Anderson et al., 1995). Recent upgrades encompass improvements in the calculation of solar and thermal scattering from clouds and aerosols and modelling of adjacency and non-lambertian effects (Berk et al., 1998 and 1999).

Table 1: Radiative transfer code features.

Features	CAM5S	MODTRAN4
Forward/Reverse mode computation	yes	forward
Altitude dependence	yes	yes
Spectral resolution	2.5 nm, 10 cm ⁻¹	Variable (finest = 1 cm ⁻¹)
CO ₂ , CH ₄ , NO ₂ gas models	yes	yes
BRDF models	yes	yes
Variable path length	yes	yes
Stratospheric aerosols	yes	yes
Scattering	single	single, multiple
Coupling of scattering and transmittance calculation	no	yes
Adjacency effects	yes	yes
Source of exo-atmospheric solar irradiance	Iqbal	Kurucz and others
Solar/thermal scattering from clouds	no	yes
Computation time*	2.5 sec	132 sec

* For simulation of an AVIRIS radiance spectrum on a Sun ULTRAPARC 1 workstation.

Approach

The procedure to remove atmospheric effects is outlined in Figure 1. This procedure as implemented in ISDAS is based on a look-up table (LUT) approach with tunable breakpoints as described in Staenz and Williams (1997), to reduce significantly the number of radiative RT code runs. A selected RT code was used in forward mode to generate the radiance LUTs, one for each of a 5% and 60% flat reflectance spectrum. These LUTs were produced for seven pixel locations equally spaced across the swath, including nadir and swath edges, and for single values of aerosol optical depth (or horizontal visibility) and terrain elevation, and for a range of water vapour contents. The specification of these parameters and others required for input into the RT codes are listed in Table 1 for the AVIRIS and *casi*TM data. None of the BRDF options available in CAM5S and MODTRAN4 were used for this study. It should be noted that a common user interface is used for the specification of the atmospheric conditions.

For the retrieval of the surface reflectance, the LUTs were adjusted only for the pixel position and water

vapour content using a bi-linear interpolation routine (Press et al., 1992) since single values for the other LUT parameters were used for the entire cube. For this purpose, the water vapour content was estimated for each pixel in the scene with an iterative curve fitting technique (Staenz et al., 1997). The surface reflectance ρ was then calculated for each pixel as follows (Teillet et al., 1991; Williams et al., 1992):

$$\rho = \frac{L - L_a}{A + B + S(L - L_a)}, \quad (1)$$

where L is the at-sensor radiance provided by the image cube, L_a is the radiance backscattered by the atmosphere, S is the spherical albedo of the atmosphere, and A and B are coefficients that depend on geometric and atmospheric conditions. The unknowns A , B , S , and L_a were calculated from the equations

$$L_{gi} = A \frac{\rho_i}{1 - \rho_i S} \quad \text{and} \quad L_{pi} = B \frac{\rho_i}{1 - \rho_i S} + L_a, \quad (2)$$

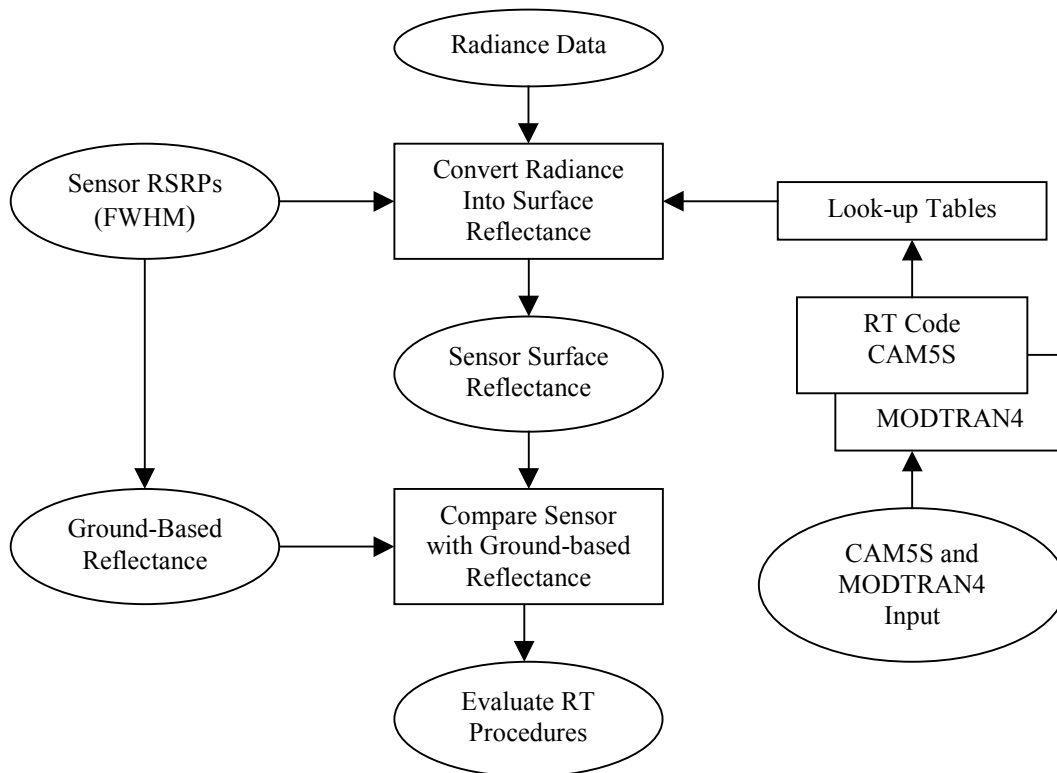


Figure 1: Processing data flow for the evaluation of surface reflectance retrieval with CAM5S and MODTRAN4 (RT = radiative transfer, RSRP = relative spectral response profile, and FWHM = full width at half maximum).

Table 2: Input Parameters for Radiative Transfer Code Runs

Sensor	AVIRIS	<i>casi</i> TM
Atmospheric model	US standard	Mid-latitude summer
Aerosol model	Desert	Continental
Date of overflight	June 17, 1998	July 25, 1996
Solar zenith angle	25.9°	31.3°
Solar azimuth angle	118.5°	155.9°
Sensor zenith angle	Variable	Variable
Sensor azimuth angle	Variable	Variable
Terrain elevation above sea level	1.435 km	0.250 km
Sensor altitude above sea level	20.800 km	2.745 km
Water vapour content	variable	variable
Ozone column	as per model	as per model
CO ₂ mixing ratio	as per model (CAM5S) 300 ppm (MODTRAN4)	as per model
Aerosol optical depth @ 550 nm	0.041	---
Horizontal visibility	---	40 km

where L_{gi} is the at-sensor radiance reflected by the target and L_{pi} is the at-sensor radiance scattered into the path by the atmosphere and the surrounding targets. These equations can be solved on a per pixel basis for each set of parameters $\{\rho_i, L_{gi}, \text{ and } L_{pi}\}$ obtained from the LUTs by interpolation for the different geometric and atmospheric conditions. With $i = 1$ and 2 ($\rho_1 = 5\%$, $\rho_2 = 60\%$), this yields a system of four equations with four unknowns.

Results

Figure 2 shows the results of the different RT code computations for the playa target from the AVIRIS scene in comparison with the reflectance acquired on the ground. The US62 (CAM5S) and US76 (MODTRAN4) standard atmospheres in combination with the desert aerosol model were selected for the RT code runs. In this case, the measured aerosol optical depth of 0.041 was used. The code input value for the water vapour content was estimated from the image data themselves (Table 3). The estimated value of MODTRAN4 is close to the measured water vapour content of 1.1 g/cm². CAM5S overestimated the water vapour content considerably. The main reason for these differences lies most likely in the accuracy of the gaseous transmittance models and the wavelength grids selected to run these models. The finest available grids of 1 cm⁻¹ (MODTRAN4) and 10 cm⁻¹ (CAM5S) were used for the RT code runs.

Table 3: Water vapor content retrieved with RT codes.

	AVIRIS	<i>casi</i> TM
CAM5S	1.54 g/cm ²	2.04 g/cm ²
MODTRAN4	1.07 g/cm ²	1.77 g/cm ²
Measured	1.1 g/cm ²	-

It is obvious from Figure 2 that the retrieved surface reflectance spectra are not as smooth as the ground-based reflectance with some exception in the visible wavelength regions. Major areas of concern are the gas absorption regions. The reflectance is especially affected in the 940-nm and the 1130-nm water absorption bands, as well as in the wings of the strong 1380-nm and 1870-nm water absorption regions. These effects would be a magnitude larger for CAM5S, if the measured water vapour content would have been used. Problems were also encountered in the O₂ absorption regions, especially in the 760-nm absorption feature for CAM5S and to some extent in the 1265-nm region for both RT codes. The same is valid for the CO₂ region at 2055 nm for CAM5S. MODTRAN4 compensated basically for this feature due to an adjustable CO₂ mixing ratio. This value was set to 300 ppm for this study. Although an improvement of the reflectance was achieved with this value, a mixing ratio of approximately 360 ppm is more realistic to reflect today's atmospheric CO₂ condition. The absolute difference plots show that MODTRAN4 clearly outperforms CAM5S in the gas absorption regions. These differences are mainly due

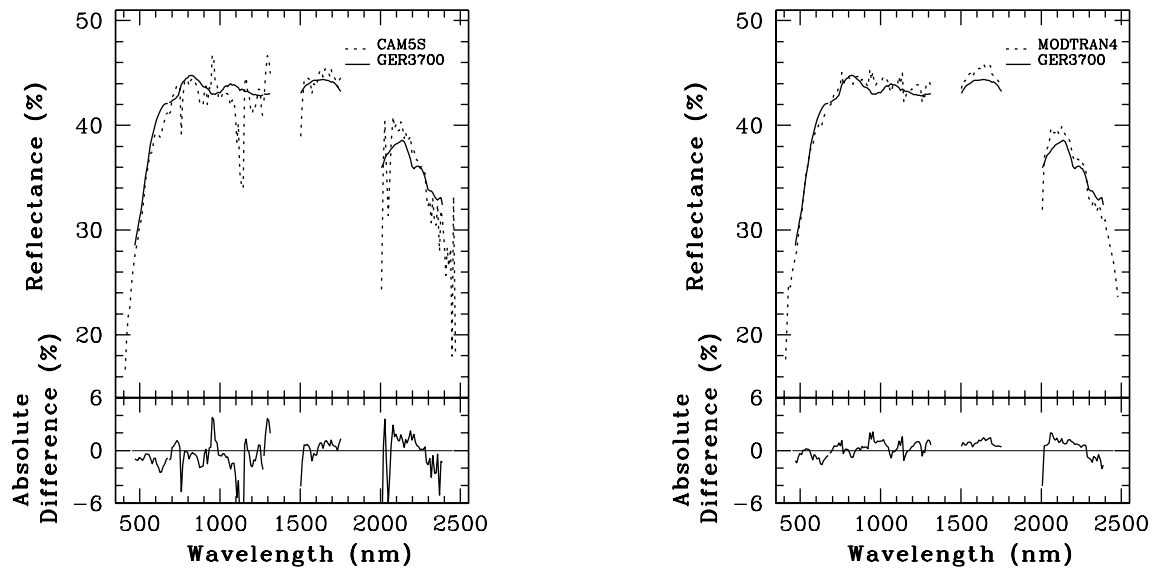


Figure 2: Comparison of surface reflectance retrieved with CAM5S (left) and MODTRAN4 (right) from AVIRIS Railroad Valley playa data with data measured on the ground with a GER3700™ spectroradiometer. The bottom plots emphasize the absolute differences between the AVIRIS and the ground spectrum. The AVIRIS spectra were averaged over a 3 x 3 pixel area while the GER3700™ spectrum was generated from 20 measurements..

to the use of different transmittance models in these RT codes. Also the wavelength grid interval is different for the RT codes considered as pointed out in the previous paragraph. Line wing absorption effects are accounted for in the calculation of the transmittance in MODTRAN4, but not in CAM5S.

Significant differences occur also in the 2100-nm to 2450-nm region between the retrieved and ground reflectances. These differences are mostly due to the different exo-atmospheric solar irradiance functions used in the RT codes (Staeenz et al., 1995). These functions are based on Iqbal (1983) for CAM5S, and Kurucz (1994) for the MODTRAN4 run.

MODTRAN4's performance with a maximum absolute difference of + 2 % to - 4 % between the spectral reflectance retrieved from AVIRIS data and the ground measurements is superior to the performance of CAM5S with a difference of + 4 % to -12 %. Without consideration of the wings of the 1870-nm absorption feature, the absolute errors for the MODTRAN4 case are between $\pm 2\%$. The absolute errors translate into an average relative error between retrieved and ground-based reflectance of 2.0 % for MODTRAN4 considering the maximum absolute difference range. These relative errors become larger for CAM5S of up to 3.7 %. The better overall

performance of MODTRAN4 was expected since CAM5S makes extensive use of analytical expressions. This leads to a shorter computation time for the CAM5S runs, approximately by a factor of 50 for a single run. With each MODTRAN4 run taking 132 sec on a Sun ULTRASPAC 1 workstation, this resulted in a total computation time of 123 minutes for the LUT calculations for the AVIRIS cube.

Figure 3 portrays the results from the RT code runs for the canola target extracted from the *casi*™ cube. The input parameters to run the codes are summarized in Table 1. The water vapour amount was estimated on a pixel-by-pixel basis from the scene itself for the RT code computations. The results follow a similar pattern as for the AVIRIS cases (Table 3). Due to the lack of a simultaneously acquired ground-based reflectance spectrum, data collected from a canola field outside of the image cube were used as a reference. Although the field conditions were similar as for the field in the *casi*™ scene, no quantitative difference measures were computed. Despite the fact that the location of the retrieved and the ground-based spectra is different, the match between the two spectra is fairly good for both RT codes. As for the AVIRIS cases, problems occur in the gas absorption regions, especially in the 760-nm O₂ absorption region for CAM5S and in the 940-nm H₂O absorption feature for

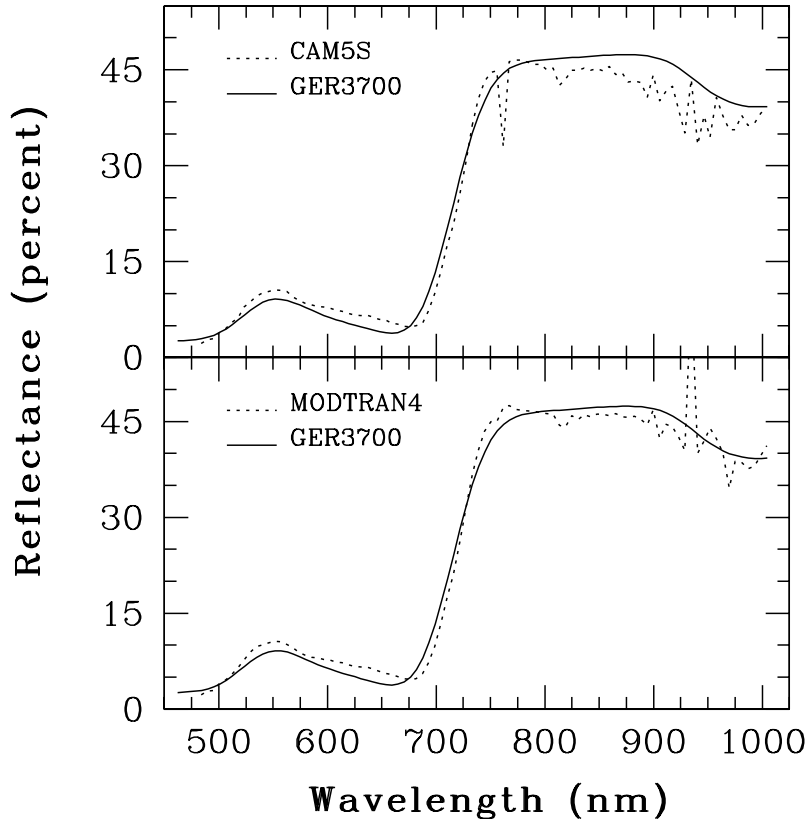


Figure 3: Canola surface reflectance spectra retrieved with CAM5S (top) and MODTRAN4 (bottom) from a *casi*TM image cube in comparison with a reflectance spectrum acquired on the ground. The *casi*TM spectra were averaged over a 2 x 3 pixel area while the ground-based spectrum was retrieved from 7 measurements.

both RT code cases. Without considering the large over-correction of the reflectance in the 940-nm region, the MODTRAN4 computation achieved the best overall result. This over-correction of the reflectance for the MODTRAN4 case is not fully understood yet.

Conclusions

Surface reflectance spectra retrieved with the RT codes CAM5S and MODTRAN4 from an AVIRIS data cube acquired over the Railroad Valley playa in Nevada were compared with simultaneously collected ground-based reflectances. For the ambient atmospheric condition, MODTRAN4 achieved the best results with an average relative difference of 2 % compared to a relative difference of 3.7 % for the CAM5S case. These relative differences are within the uncertainty limits of the ground-based reflectances. MODTRAN4 clearly outperformed CAM5S in the gas absorption features, especially in the 940-nm and 1130-nm H₂O region as well as in the 2055-nm CO₂

region. This is most likely due to the fact that MODTRAN4 makes use of more accurate gaseous transmittance calculations and a finer spectral resolution than the CAM5S code. Outside the strong gas absorption features, the performance was similar for both RT codes with exception of the 2100-nm to 2450-nm region where differences occur mainly due to the use of different exo-atmospheric solar irradiance data bases. The results associated with the visible and near-infrared region are similar to those obtained from the *casi*TM data over a canola target. An exception is the strong over-correction of the reflectance in the 940-nm H₂O region for the MODTRAN4 run. The two RT codes used for the estimation of atmospheric water vapour from the data cubes themselves led to different water vapour values. Since CAM5S makes extensive use of analytical expressions and coarser spectral resolution, its computation time is about 50 times faster than for MODTRAN4.

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