# Assessment of atmospheric carbon dioxide and aerosols from ground spectroradiometry and hyperspectral image analysis

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By

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### Recommendation

Atmospheric carbon dioxide (CO<sub>2</sub>) is the greenhouse gas most vulnerable to human activities and has serious effects on climate change. Developing precise monitoring systems for CO<sub>2</sub> has been an important issue during the last two decades. The present work has applied the physical principles of assessing gaseous concentration from the spectral absorption of radiation to the estimate of CO<sub>2</sub> and has proposed several new methodologies and results in that connection. It has applied the techniques of hyperspectral remote sensing, popularly known as 'imaging spectroscopy' in three different ways: ground-based high resolution spectroscopy, airborne hyperspectral images and satellite-borne hyperspectral database. Analyses are made for both global and local levels, particularly in the Indian context. Both the atmospheric column average and the surface level CO<sub>2</sub> concentrations are estimated. The spatial as well as the temporal variations of the column concentration are explored. This work may be recommended as a study on the recent CO<sub>2</sub> scenario of India and world that has both application of physics and interdisciplinary relevance.

#### **Summary and Conclusion**

This work has addressed several facets of the present  $CO_2$  scenario and its correlations with human activities. The spatial distribution of  $CO_2$  abundance is estimated by propounding a new methodology for averaging the  $CO_2$  absorption depths, referred to as *a*-DOAS in this connection. The candidate believes that this is the first report on the spatial distributions of  $CO_2$ column averages at different places of the tropical atmosphere of India, retrieved from AVIRIS-NG image analysis.

A novel technique is put forward for the radiation absorption correction for atmospheric water vapour by comparison with the spectral radiance of Mars' atmosphere. A balanced condition of anthropogenic emission and vegetative sequestration was revealed for the places of varied  $CO_2$  source and sink potentials. A steady linear increase in the  $CO_2$  concentration was found in the Indian atmospherefor the past two decades. This work has also developed a technique for the spatial mapping of atmospheric water vapour concentration by comparing two consecutive  $CO_2$  absorption bands. The detection of point sources of  $CO_2$  from high spatial resolution airborne hyperspectral image is validated by comparing the  $CO_2$  extent at Jharia coalifield and that at other urban regions.

The seasonal variation of atmospheric  $CO_2$  is studied in both time and frequency domains. The reason for the annual variability of  $CO_2$  in India is explained as a combined

influence of vegetation vigour and atmospheric pressure and temperature. The interpretation is made more generalized by developing a climate model based on the vertical redistribution of CO<sub>2</sub> molecules.

The study incorporates the analysis of the data procured by Orbiting Carbon Observatory-3 (OCO-3), the recent-most global CO<sub>2</sub> sensor. During the work, an unexpected situation of global lockdown took place related to the novel coronavirus (COVID-19) pandemic. The consequent restricted fossil fuel burning situation might have some effect on the atmospheric CO<sub>2</sub>. Considering this point, a comparative analysis with the predecessor Orbiting Carbon Observatory-2 (OCO-2) was carried out and a temporary reduction in the CO<sub>2</sub> column average was noted, especially in the urban regions. A wavelet coherence technique was adopted to quantifying that reduction.

Along with CO<sub>2</sub>, this work has taken into account urban aerosols as closely related to man-made activities and has estimated the aerosol optical depth from hyperspectral images. In brief, the main highlights of the work are spectral calibration of CO<sub>2</sub> absorption profile, spatial distribution of the concentration of CO<sub>2</sub> column average, detection of point source, the correction of CO<sub>2</sub> absorption profile due to the influence of water vapour in the tropical atmosphere of India, new techniques for estimating CO<sub>2</sub>, aerosol and water vapour concentrations, seasonal changes of CO<sub>2</sub> and aerosol and the present trends of CO<sub>2</sub> in Indian and Global context.

### **Future Scopes**

This work has noted that the regions of wide variations of  $CO_2$  and its sequestering agents, when accommodated to coarser spatial resolutions, such as that of global  $CO_2$  sensors like OCO-2 and OCO-3, the diversities in emission and sequestration are averaged out and an overall uniformity of  $CO_2$  column average is obtained. A reasonably steady increase in the atmospheric  $CO_2$  is obtained in the Indian environment, which may be credited to the wideranging vegetated regions dispersed throughout the country. In contrast, higher values of  $CO_2$ at deep sea regions hint at the insufficiency of the slow sea sequestration to meet the global increase. These findings may be explored in future as an interdisciplinary issue.

The global  $CO_2$  sensors like OCO-2 and OCO-3, because of coarser spatial resolution may be unable to detect local point sources of  $CO_2$ , hence the local atmospheric changes. This opens the scope for adopting a similar methodology, like the present one, of procuring hyperspectral images more frequently with more adjustable platforms, such as drones. The database thus built-up can be networked to develop an Internet of things for smart monitoring of local variations of atmospheric CO<sub>2</sub> due to human activities.

The present work has established that the vertical redistribution of air-mixed  $CO_2$  molecules can cause an apparent change in the atmospheric radiation absorption path and an apparent change in the gas concentration. A similar treatment, considering the changed conditions of temperature and pressure is expected to be a useful climate model for interpreting the  $CO_2$  concentration.

The present work has established from different angles of studies that the atmospheric  $CO_2$  assessment in India has some specific features. It is a big and densely populated country with high fossil fuel burning and diversified environments. The tropical atmosphere contains widely varying water vapour concentration that can partly mask the radiation absorption profile of  $CO_2$ . Considering these features, the present methodologies involving the combination of field work of surface level  $CO_2$  measurement and spectroradiometric assessment of the  $CO_2$  column average, spectral standardization, analyzing the hyperspectral images, comparing with open source satellite data and recording the seasonal, spatial long term temporal variations may be adopted in future also.