

Near-Global Survey of Cloud Column Susceptibilities Using ISCCP Data

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Short title: SATELLITE RETRIEVAL OF CLOUD COLUMN SUSCEPTIBILITIES

Abstract. A new parameter, cloud column susceptibility, is introduced to study the aerosol indirect effect. There are several advantages of this new parameter in comparison with the traditional cloud susceptibility. First, no assumptions about constant liquid water content and cloud layer thickness are required in calculations so that errors caused by these assumptions can be avoided. Second, no *a priori* knowledge of liquid water content is necessary in remote sensing, which makes global survey by satellite data possible even though liquid water content may change significantly. Third, this new parameter can deal with variations of cloud geometrical thickness during cloud-aerosol interactions, which are evidenced by observations. Without assuming how cloud droplet size will respond to changes of number concentration, this new parameter describes the aerosol indirect effect more directly. It addresses the question of how cloud albedo changes with increasing column number concentrations of cloud droplets, which is resulted from cloud-aerosol interactions. In this study, two approaches are used to retrieve cloud column susceptibility by satellite data. The results of both approaches show a striking contrast of cloud column susceptibilities between continental and maritime. Between the two approaches, the one that uses no assumption of constant liquid water content leads to smaller, some times even negative, cloud column susceptibilities. This finding suggests that the aerosol indirect effect may be overestimated if the assumption of constant liquid water content is used in model studies.

1. Introduction

Among possible radiative forcings that can cause long-term climate change, the effect of changing tropospheric aerosols on cloud properties (called the aerosol indirect effect) is the most uncertain (0 to -1.5 Wm^{-2}) relative to the other known forcings, and which is the only one without even a mid-range estimate (IPCC, 1996). Recent model study further suggests that the indirect aerosol effect may be playing vital role in global change (Hansen et al., 1997).

One approach to estimate the aerosol indirect effect is to evaluate the cloud albedo change due to variations of aerosol loading. Twomey (1991) first introduced the concept of cloud susceptibility, defined as cloud albedo change versus number concentration change of cloud droplets, $d\alpha/dN$, which is a valuable parameter that indicates where clouds are more susceptible to the cloud-aerosol interaction. However, the accuracy of calculation and feasibility of remote sensing of this parameter have been limited by the assumption used in the calculation and certain information required in the remote sensing (liquid water content). Traditionally, the calculation of cloud susceptibility is based on assumptions of constant liquid water content and cloud geometrical thickness (Platnick and Twomey, 1994, Taylor and Mchaffie, 1994). These assumptions are often violated even for non-precipitating clouds. Because a balance between condensation and evaporation is difficult to maintain since they depend on supersaturation (and thus vertical velocity), humidity of the ambient air far from the droplet, diffusion coefficient, and cloud droplet size. In reality, during the cloud-aerosol interactions these factors are always changing. Observations show different cases where liquid water content increases (e.g., Radke et al., 1989), decreases (e.g. Fitzgerald and Spyers-Duran 1973), or approximately holds constant (e.g., Leaitch et al. 1992). For more detailed discussion on this issue, readers are suggested to read *Han et al. (1998a)* and the references therein. There are also observational evidences showing that cloud geometrical thickness increases when aerosols were activated to form cloud droplets (e.g., Hobbs et al. 1970).

Another problem that makes the remote sensing of the cloud susceptibility on a global scale difficult is the fact that *a priori* knowledge of liquid water content is required. In the

pioneer study of remote sensing of cloud susceptibility (Platnick and Twomey, 1994), the equation used is in the form

$$\frac{d\alpha}{dN} \approx \frac{\partial\alpha}{\partial\tau} \frac{d\tau}{dN} \approx \frac{\partial\alpha}{\partial\tau} \frac{\tau}{3N} = \frac{4\pi\rho_w}{9w} \alpha(1-\alpha)r_v^3; \quad \alpha \approx \frac{(1-g)\tau}{2+(1-g)\tau} \quad (1)$$

where w represents the cloud liquid water content. Although the effective radius, r_e , and optical thickness, τ , can be retrieved from satellite, values of liquid water content has to be known in order to retrieve the cloud susceptibility. In the study of Platnick and Twomey, $g \approx 0.85$, $r_v = r_e$, $w = 0.3 \text{ g/m}^3$ were assumed. This approach is valid for case studies when the liquid water content can be obtained by other measurements. However, in general, liquid water content depends on entrainment and saturated adiabatic values that vary strongly from cloud to cloud. The values of liquid water content range from 0.2 g/m^3 up to 5 g/m^3 (e.g., Pruppacher and Klett, 1997, p23), which may cause the resultant uncertainty in cloud susceptibility more than one order of magnitude if global survey of this parameter is conducted.

In addressing the important issue of the aerosol indirect effect, we used ISCCP data to estimate cloud-aerosol interactions on a near-global scale. Since the difficulties in calculating and remote sensing of the parameter of cloud susceptibility, we developed a new parameter, *cloud column susceptibility*. This new parameter has several advantages. First, it can be easily used in model calculations without the assumption of constant liquid water content. Second, it can be retrieved globally using satellite data without the assumption of an average value of liquid water content. Third, this new parameter has already included the effect of possible variations of cloud geometrical thickness during cloud-aerosol interactions, which are reported from observations (e.g., Hobbs et al., 1970). Traditional way of estimating the indirect aerosol effect is to evaluate droplet size change due to changes in number concentration of cloud droplets under the assumption of constant liquid water path. However, this approach may introduce errors when cloud liquid water content is not constant, as evidenced by many observations. This new parameter describes the indirect aerosol effect more directly without assuming how cloud droplet size will respond to changes of number concentration. To be more specific, the cloud column susceptibility describes

how cloud albedo changes with increasing column number concentrations of cloud droplets, which is resulted from cloud-aerosol interactions.

The cloud column susceptibility is retrieved using two approaches, i.e., with and without the assumption of constant liquid water content in order to evaluate the difference and to compare with results of other investigations.

2. Method

The cloud column susceptibility is defined by

$$S_c = d\alpha / dN_c \quad (2)$$

where α is cloud spherical albedo and N_c is cloud column droplet concentration. The column droplet concentration is defined by

$$N_c = I \cdot h \quad (3)$$

The retrieval method of N_c , validation effort, and results of a global-survey have been described by *Han et al.* (1998b). The global distribution of N_c show the expected increase of column droplet concentrations between ocean and continental clouds and in tropical areas during dry seasons where biomass burning is prevalent. It is demonstrated that column droplet concentration is a good indication of available CCN populations in certain areas.

Two approaches are used to retrieve cloud column susceptibility. One approach uses the assumption of constant liquid water content and the other approach does not. In both approaches, cloud optical thickness and effective droplet radius are retrieved using the three-channel method (*Han et al.* 1994). We retrieve cloud optical thickness (τ) and effective droplet radius (r_e) from satellite-measured radiances at 0.63, 3.7 and 10.7 μm wavelength (channels 1, 3 and 4 of AVHRR on NOAA polar orbiting satellites). This is performed by comparison with calculations from a radiative transfer model that represents the spectral and angle dependence of radiation, accounting for multiple scattering by gases and clouds and for other atmospheric and surface effects. The analysis is applied to pixel-level data (stage CX data) from the International Satellite Cloud Climatology Project (ISCCP, *Rossow and Schiffer*, 1991) which identifies cloudy satellite pixels.

Liquid water clouds are identified by channel 4 brightness temperatures > 273 K, implying cloud tops below the freezing level. Individual pixels are about 5 km across and have been sampled at intervals of about 30 km. Since cloud scattering at $0.63 \mu\text{m}$ is conservative, τ values represent the whole cloud layer. However, most of the signal at $3.7 \mu\text{m}$ used to determine r_e comes from the uppermost portion of the cloud (Han *et al.*, 1994).

2.1 Approach One: Assuming constant liquid water content

Under the assumption of constant water content, we have

$$\frac{d\tau}{dN_c} = \frac{\tau}{3N_c} \quad (4)$$

and thus the column cloud susceptibility is

$$S_c = \frac{d\alpha}{dN_c} \approx \frac{\partial\alpha}{\partial\tau} \frac{d\tau}{dN_c} \approx \frac{\partial\alpha}{\partial\tau} \frac{\tau}{3N_c} = \frac{\alpha(1-\alpha)}{3N_c} \quad (5)$$

The column droplet concentration, N_c , and the spherical albedo of cloud, α , are retrieved from satellite radiance data (Han *et al.*, 1998a, b). Based on these retrievals, the column susceptibility can be derived for each cloud pixels. This approach is similar to the one used by Platnick and Twomey (1994) in retrieving cloud susceptibility. The major difference is that the parameter retrieved here is cloud *column* susceptibility in which no assumption about the value of liquid water content is required. Hence, it can be applied in any region no matter what the value of cloud liquid water content might be.

This approach is actually answering the following question: giving the current cloud properties, if cloud liquid water content will not change during cloud-aerosol interactions, what would be the cloud column susceptibility. Apparently, the calculated (or predicted) cloud column susceptibility will be incorrect if the assumption of constant liquid water content is invalid, which is the case from many observations. In essential, the assumption of constant liquid water content is a constraint about the droplet size change in response to the change of number concentration due to cloud-aerosol interactions. Under this assumption, the response is equivalent to,

$$\frac{dr_e}{dN} = -\frac{r_e}{3N} \quad (6)$$

In reality, cloud liquid water content has been observed to increase, decrease or maintain constant and thus the responses can be quite different. Different behaviors of liquid water content lead to different results of cloud susceptibility. To determine these behaviors for a specific cloud pixel from satellite data is very difficult, if not impossible. Therefore, we used the regression method as the second approach in which the tendency of changes in cloud liquid water is implicitly determined by all cloud pixels in a grid box.

2.2 Approach Two: Regression Method

Under this approach, no assumption about liquid water content is made and biases caused by this assumption are eliminated. The column susceptibility

$$S_c = \frac{d\alpha}{dN_c} \approx \frac{\Delta\alpha}{\Delta N_c} \quad (7)$$

is derived from statistical regression with N_c and α retrieved from satellite radiance data (Han et al., 1998a). The column susceptibility values of each $2.5^\circ \times 2.5^\circ$ grid box are derived from a linear regression of all water cloud pixels (determined by cloud top temperature >273 K) within this grid box during one month. Typical pixel numbers are >100 for each grid box. If pixel number in a grid box is less than 10, no regression is conducted and the grid box is left blank.

This approach does not assume the behavior of cloud liquid water. Instead, it uses regression technique to find the value of cloud column susceptibility that is a result of dominant behavior of cloud liquid water in a grid box within the period of one month.

3. Results

Figures 1 and Fig. 2 are the retrieved column susceptibility for thin ($\tau \leq 15$) clouds by the first and the second approaches, respectively. Figures 1 and 2 both show the striking contrast of cloud column susceptibilities between continental and maritime clouds. For clouds over most of continents, the column cloud susceptibility is around zero or slightly positive ($\leq 1.8 \times 10^{-8} \text{ cm}^2$),

suggesting little cloud albedo change due to the cloud column droplet concentration change. For most oceanic clouds, the column susceptibilities are high, suggesting a large albedo increase due to an increase in the column droplet concentration. Under clean oceanic environment, for a typical maritime cloud with 300 m physical thickness, the column cloud susceptibility of $6.6 \times 10^{-8} \text{ cm}^2$ means that an increase in volume cloud droplet concentration of 10 cm^{-3} would increase cloud albedo by 2.0%. This is plausible due to the volume cloud droplet concentration of a typical marine cloud is only about 40 cm^{-3} .

Case studies of cloud susceptibility from California and Namibia regions were reported by Platnick and Twomey (1994) and Taylor and McHaffie (1994). The results of Platnick and Twomey, using AVHRR at $\sim 15 \text{ km}$ resolution for ship-track region in stratocumulus west of Washington State on March 2, 1990, are used here for comparison because detailed information of cloud properties are included. All the twenty-eight retrieved results of cloud susceptibilities are converted to cloud column susceptibilities by the liquid water path and liquid water content reported in their studies. The converted cloud column susceptibility of these 28 cases is $10.6 \pm 9.6 \times 10^{-8} \text{ cm}^2$. The value will be $21.5 \pm 8.5 \times 10^{-8}$ if only out-of-track regions (10 cases) are considered and $4.6 \pm 1.3 \times 10^{-8} \text{ cm}^2$ if only in-track regions (18 cases) are included. The total averaged value is in good agreement with the results of west of Washington State in April 1987 ($10\text{--}12 \times 10^{-8} \text{ cm}^2$) if constant liquid water content is assumed (Fig. 1). Note that their results are based on an average liquid water content value of 0.3 g/m^3 in retrievals and this comparison shows that this assumed value is representative in that region and season. Another data used for comparison is from observations in marine stratocumulus clouds at the west coast of southern California in the vicinity of 32°N and 120°W in July 1987 (Radke et al., 1989). According to the cloud properties supplied in the paper ($r_c=10\text{--}12 \text{ }\mu\text{m}$, $w=0.3\text{--}0.4 \text{ g/m}^3$, $\Delta z=500\text{m}$) and using equation (1), the range of the converted cloud column susceptibility is from $1.5 \times 10^{-8} \text{ cm}^2$ to $3.9 \times 10^{-8} \text{ cm}^2$. This agrees well with the value of 2.0×10^{-8} to $4.0 \times 10^{-8} \text{ cm}^2$ from Fig. 1 for July 1987 at the west coast of California.

The main difference between results from Figs. 1 and 2 is that the column susceptibility is smaller if no constant water content is assumed in the retrieval. The reason will be discussed

later. This difference is more significant over continents and surrounding ocean areas. For example, in July, at the West Atlantic, the average cloud column susceptibility drops from about $9.0 \times 10^{-8} \text{ cm}^2$ (assuming constant liquid water content) to about $1.6 \times 10^{-8} \text{ cm}^2$ (no assumption about liquid water content). This may be caused by the air pollution from the East Coast of the United States.

The major difficulty in understanding the statistically regressed susceptibility is the negative values because the derivative dc/dN_c is thought to be positive in all cases, which is actually only valid if one keeps the liquid water content constant. To be more specific, an increase of cloud droplet number may lead to two consequences: increasing cloud optical thickness and decreasing cloud droplet size. The decrease of cloud droplet size may be thought to cause an increase of cloud optical thickness because

$$\tau = \pi \int_0^h \int_0^\infty Q_{ext} r^2 n(r) dr dh' = Q_{ext} \frac{\pi \bar{r}^3 N}{r_e} h \approx \frac{3}{2} \frac{w}{r_e} h \quad (8)$$

where \bar{r} is the volume average droplet radius and $N = \int_0^\infty n(r) dr$ is the total number concentration of cloud droplets. Hence the cloud droplet number concentration was thought to be positively related to cloud albedo and the cloud column susceptibility could not be negative. However, the inverse relation between droplet size and optical thickness is implicitly based on the assumption of constant liquid water content, which is not supported by most observations. If this assumption is not used, then because

$$w = k r_e^3 \rho_w N \quad (9)$$

where $k = 4\pi(1-b)(1-2b)$ and b ranges from 0.10 to 0.20 (Han et al. 1994), we have

$$\tau = \frac{3}{2} \frac{w}{r_e} h = \frac{3}{2} k r_e^2 \rho_w N_c \quad (10)$$

Instead of an inverse relationship between τ and r_e , we may have τ and r_e positively correlated if N_c is close to constant as indicated by some observations (Lohmann et al., 2000). In fact, observations show that a decrease of cloud droplet size is linked with a decrease of the optical thickness for most clouds on the earth (Han et al., 1998a). In the study of cloud-aerosol interactions, cloud droplet number concentration is apparently changing and neither $\Delta w = 0$ nor $\Delta N_c = 0$ should be used. From

equation (7), the change of τ (hence the change of the cloud albedo, α) due to changes in N_c can be written as

$$\Delta\tau / \Delta N_c = 3k\rho_w r_e N_c \left[\frac{r_e}{2N_c} + \frac{\Delta r_e}{\Delta N_c} \right] \quad (11)$$

which makes cloud susceptibility negative if $\Delta r_e / \Delta N_c < -0.5r_e / N$. This condition means, by comparison with equation (6), a decrease of cloud liquid water content in the cloud-aerosol interactions.

Figure 3 is an example of positive column susceptibility from NOAA-9 data in January 1987 (located at the south of Australia). In the figure, increasing of cloud albedo is roughly determined by increases of the optical thickness. For example, albedo (α) variation between 0.15 to 0.20 corresponds to optical thickness (τ) change between 1.3 to 1.9, α between 0.20 to 0.25 corresponds to τ between 1.4 to 3.0, α between 0.25 to 0.30 corresponds to τ between 3.0 to 3.9, and α between 0.30 to 0.35 corresponds to τ between 3.6 to 4.9. Within a small interval of optical thickness, droplet sizes become smaller when the column number concentration increases, this is readily understood from equation (10). Figure 3 shows that in this region, the column number concentrations of most thin clouds are less than $2.0 \times 10^6 \text{ cm}^{-2}$ while most thick clouds are between 1.5 to $3.0 \times 10^6 \text{ cm}^{-2}$, which makes the column susceptibility positive. A comparison between two different approaches is also shown in the Fig. 3 with the column susceptibility values retrieved by approach one shown in different symbols. The unit of the column susceptibility (S_c) in the figure is 10^{-8} cm^2 . It is readily seen that the column susceptibility by approach one is strongly dependent on the value of N_c , which is understandable because the range of ΔN_c is much larger than the range of $\Delta[\alpha(1-\alpha)]$ in the equation (5). The average column susceptibility of all pixels from approach one is $6.1 \times 10^{-8} \text{ cm}^2$, larger than the result of $5.1 \times 10^{-8} \text{ cm}^2$ by the regression method. In other grid boxes, we have seen much larger differences between results from these two approaches. This comparison suggests that holding liquid water content constant may overestimate the indirect aerosol effects.

Figure 4 shows an example of negative column susceptibility of January 1987 (located at the west coast of Peru). The averaged column susceptibility using approach one is $3.2 \times 10^{-8} \text{ cm}^2$,

while the result of approach two yields $S_c = -0.63 \times 10^{-8} \text{ cm}^2$. In comparison with Fig. 3, column number concentration is larger and droplet size is smaller for all optical thickness levels. This is a result not expected by holding liquid water content constant, which would predict larger column number concentration and smaller droplet size only for larger optical thickness. An explanation is that when more CCN becomes cloud droplets and cloud droplet size population shifts to smaller values, the evaporation rate is stronger because of the curvature effect. This stronger evaporation “burns” out cloud liquid water content and prevents cloud optical thickness from increasing, which can be seen from equation (10) as the increase of number concentration cancels out the decrease of droplet radius.

4. Discussion and Conclusions

In order to reduce the uncertainty in evaluation of aerosol indirect effect, it is necessary to combine model study, in situ measurements and satellite measurements to improve our understanding of the cloud-aerosol interactions (NRC, 1996). In recent years, prognostic scheme of liquid water content has been used in GCMs (e.g., Easter et al., 1999, Lohmann et al. 1999). The results of these models show promising agreement with satellite observations on cloud droplet size, cloud column droplet concentration, and the relationship between cloud albedo and droplet sizes (Ghan et al., 1999, Lohmann et al., 1999). These progresses are important not only for evaluation of the aerosol indirect effect but also for assessment of the cloud feedback mechanisms. Apparently, we need more comparisons between observations and model studies to improve our understanding of the key processes involving the aerosol indirect effect.

A new parameter, cloud column susceptibility, is introduced in this study which can be retrieved using satellite data and can be used to compare with product of model studies. Two different approaches, with and without assumption of constant liquid water content in the cloud-aerosol interaction, were used to retrieve the cloud column susceptibility using ISCCP data. The results from both approaches show continental-maritime contrast that is consistent with differences of aerosol loading over these two surfaces. However, values of cloud column susceptibility

retrieved from no assumption of constant liquid water content are generally smaller than that from another approach. They can even become negative at some regions, a result that is not possible if liquid water content is held constant. This finding suggests that using constant liquid water content in the model may overestimate the aerosol indirect effect and that the new development of the prognostic cloud water schemes in GCMs may yield more realistic evaluations.

The cloud column susceptibility itself, without the knowledge of droplet size change and the droplet size effect on albedo, can be regarded as a description of the aerosol indirect effect. To this end, this study shows that the current aerosol indirect effect is largest over remote ocean areas (cf. Fig 2). As pollution increases, the aerosol indirect effect may become less and even saturated that is evidenced by the small (sometimes negative) values of cloud column susceptibility over most continents and surrounding areas.

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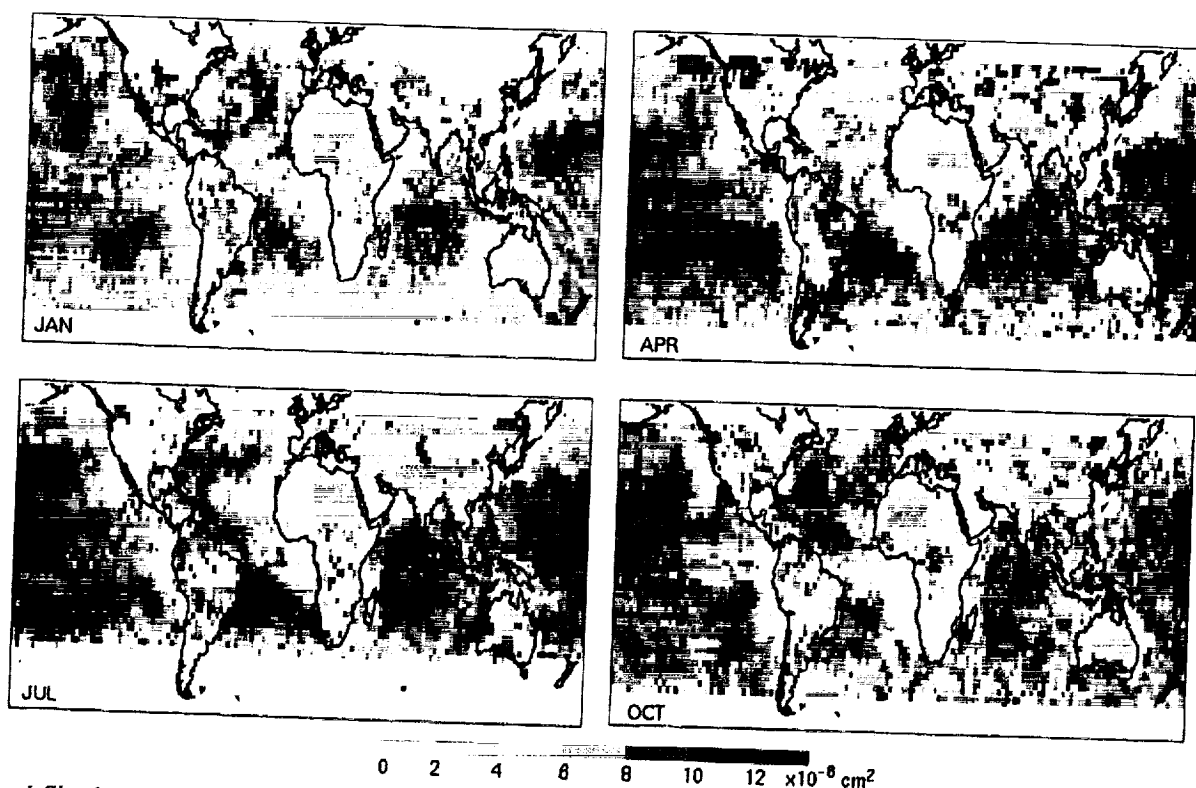


Fig. 1 Cloud column susceptibility retrieved from NOAA-9 data of 1997 under the assumption of constant liquid water content

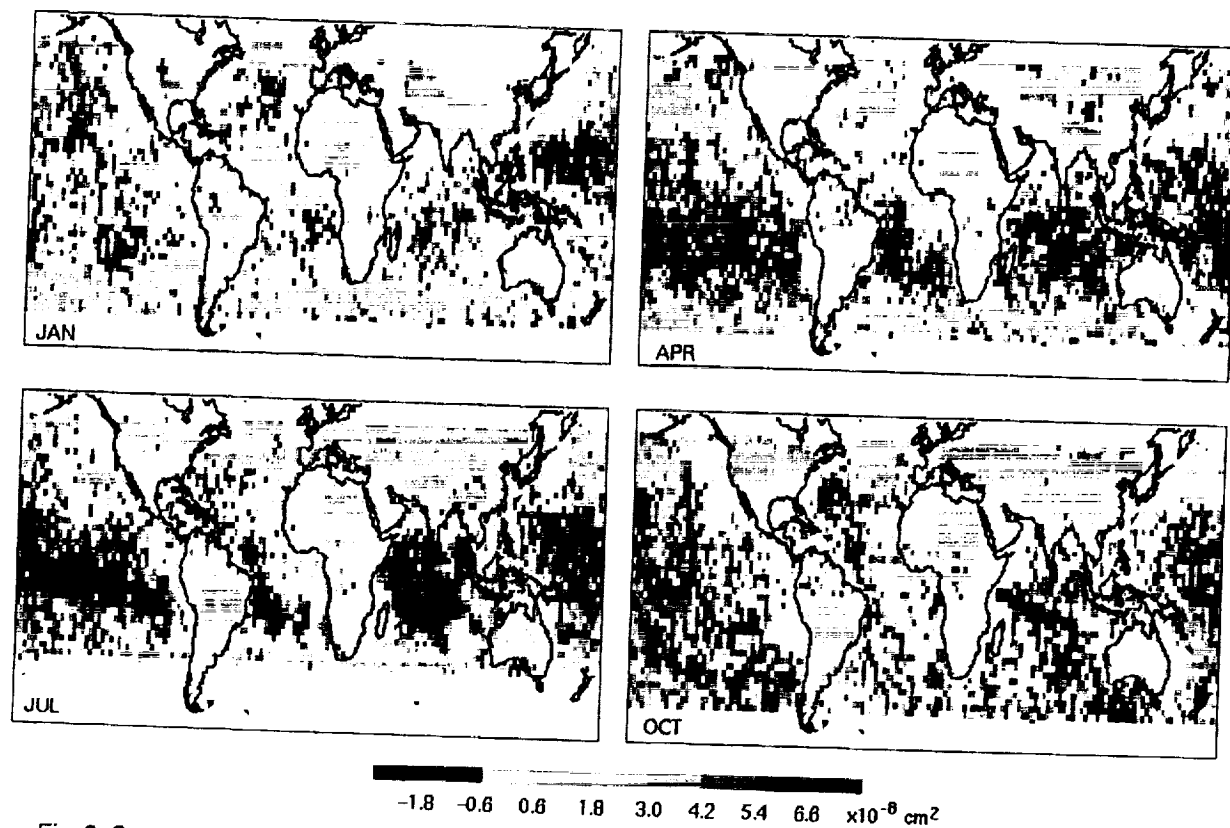


Fig. 2 Same as in Fig. 1 but with no assumption about constant liquid water content

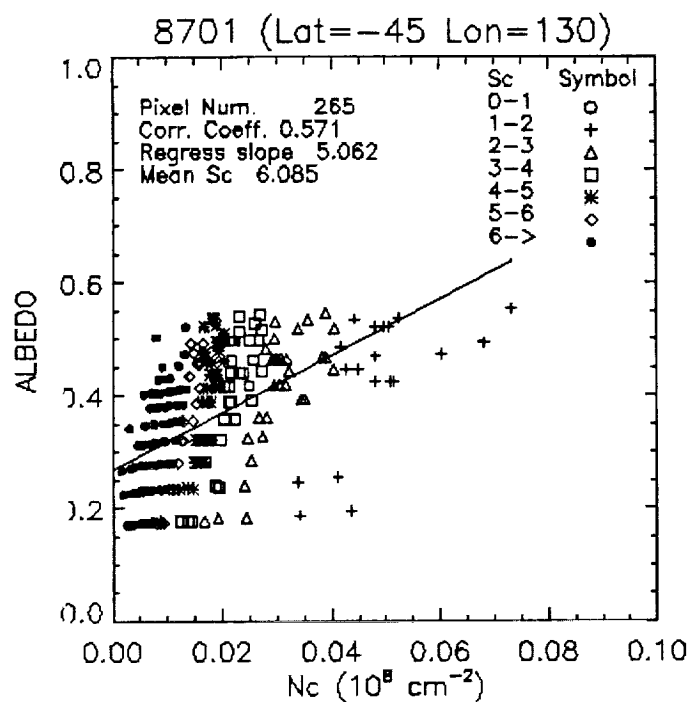


Figure 3 Example of
positive column
susceptibility within a grid
box at south of Australia

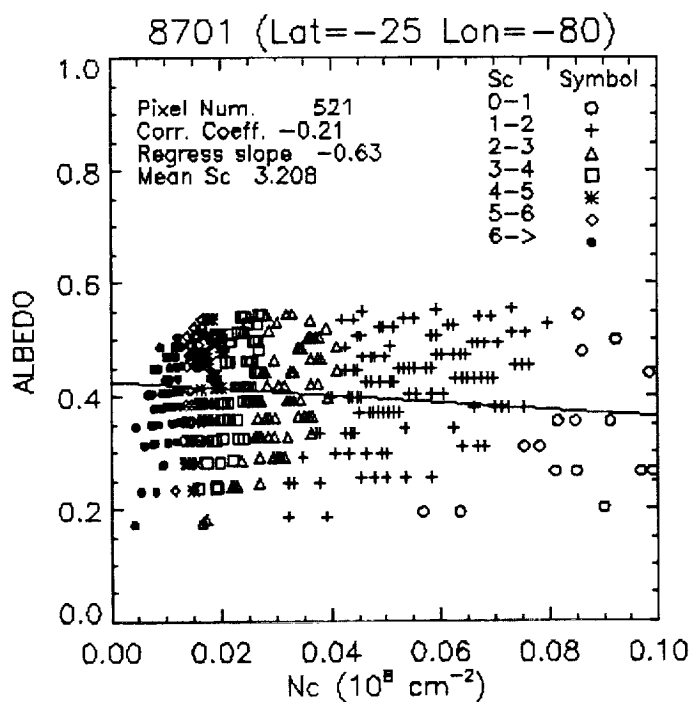


Figure 4 Example of
negative column
susceptibility within a grid
box at the west coast of
Peru.