

# Development of the Multilayer Cloudy Radiative Transfer Model for GOES-R Advanced Baseline Imager (ABI)



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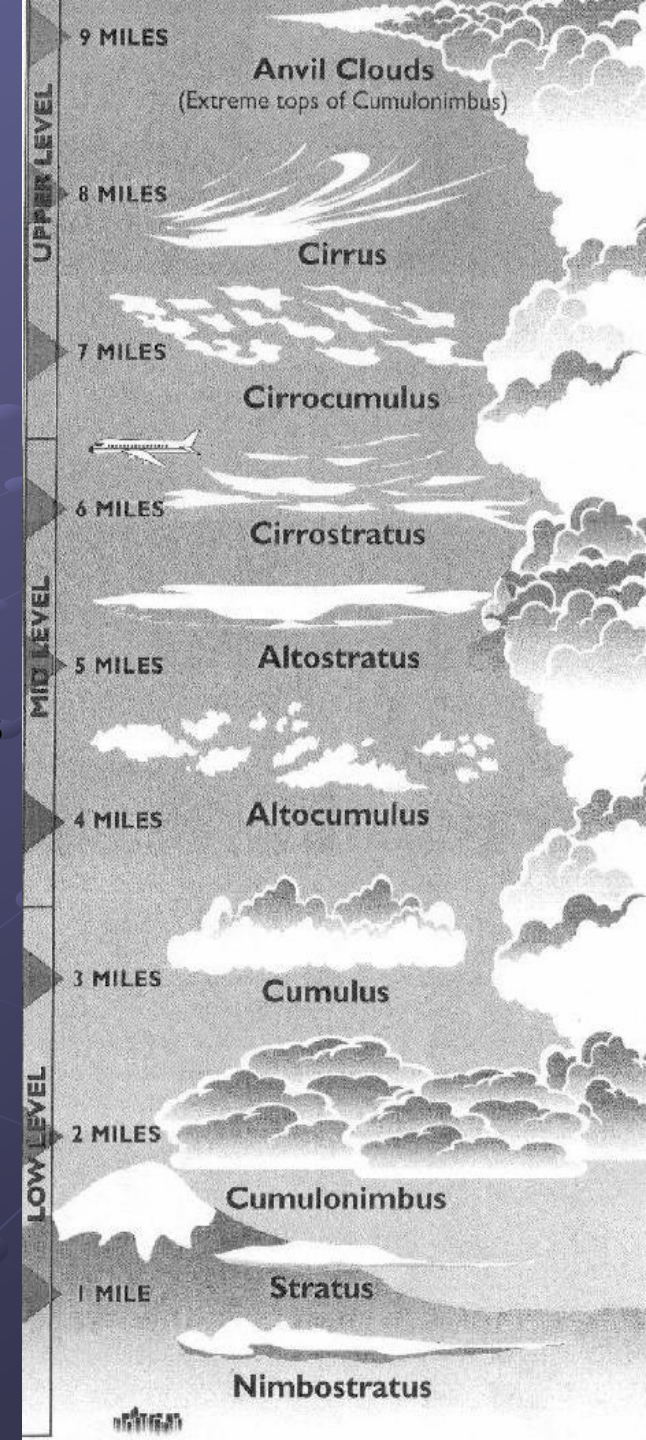


# Outline

- Multilayer Clouds – Observation, Modeling & Retrieval Issues
- Generalized Radiative Transfer Equation for Multilayer Clouds
- Applications to GOES-R Advanced Baseline Imager (ABI)
- Summary and Future Work

# Observations of Multilayer Clouds

- Multilayer clouds frequently occur in frontal areas where cirrus clouds overlie boundary layer convective clouds or stratus clouds (Hahn et al. 1982, 1984).
- The probability of cirrus clouds overlying low stratus or altostratus clouds was higher than 50% (Tian 1989).
- Field experiments such as FIRE-I (1986), FIRE-II-Cirrus (1991), UAV-ARESE (1995) and SUCCESS (1996) have also observed multiple cloud layers involving cirrus overlying lower-layer clouds.
- For a given location, it is common for two or more cloud types to occur simultaneously but at different altitudes in the atmosphere (Baum et al. 1995).
- A generalized radiative transfer model to include multilayer clouds is needed for remote sensing!

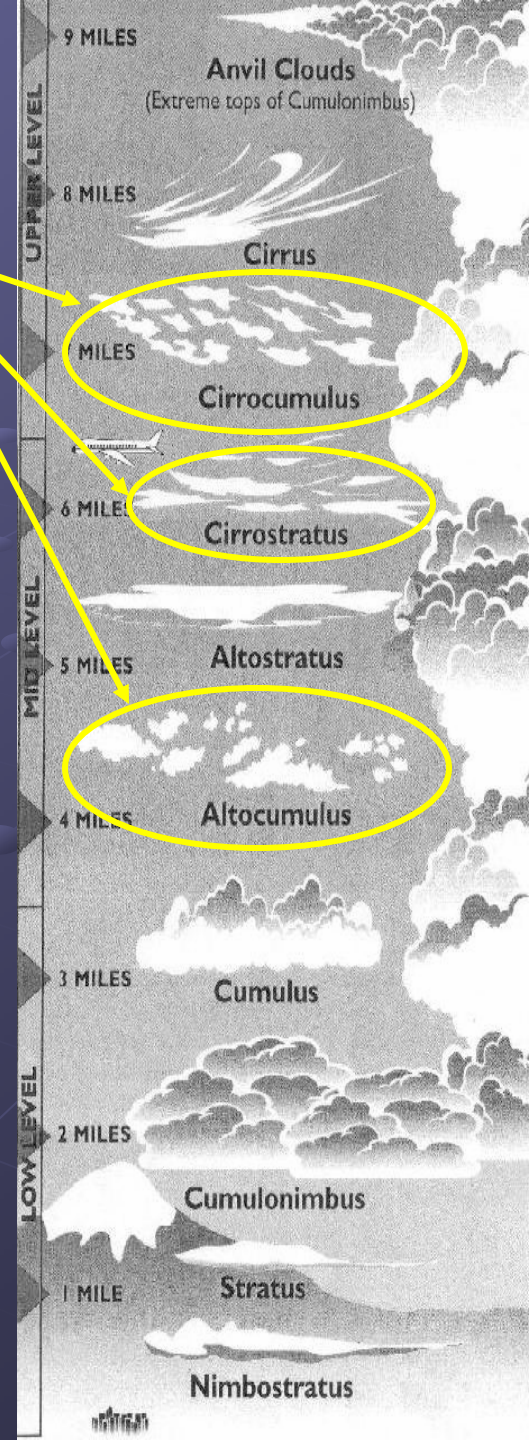
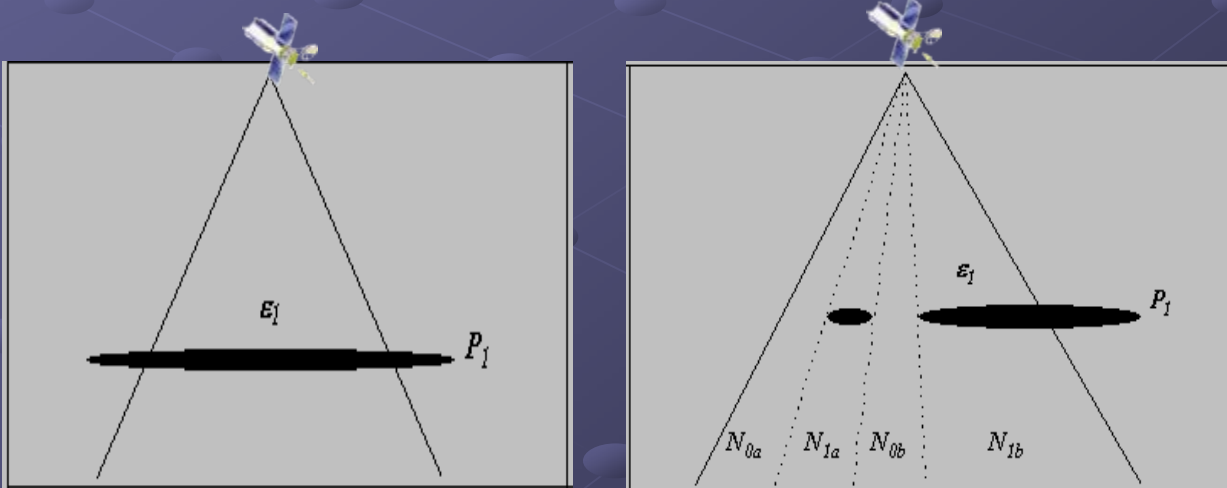


# Broken Cloud & Partial Cloud Cover

- Broken clouds exist in the real world.
- Partial cover of broken or continuous cloud within a sensor's field of view (FOV) may exist.

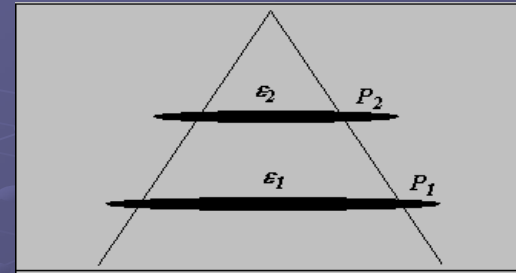
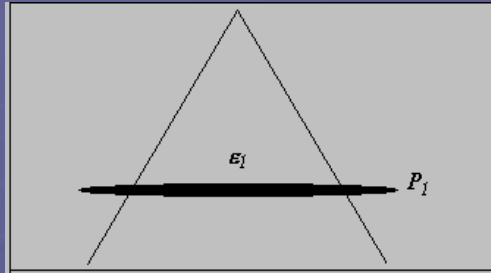
## Indistinguishable Observations

- The radiance observations from the following two FOVs may be indistinguishable to the sensor if both FOVs have the same amount of cloud fractions ( $N_1 = N_{1a} + N_{1b}$ ), given the same atmosphere and cloud properties.

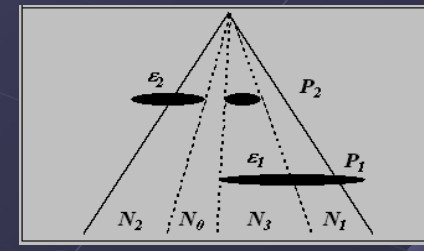
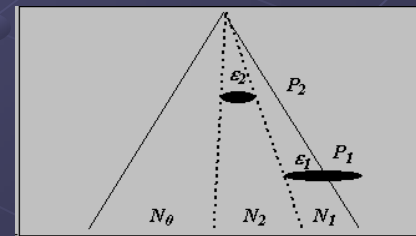
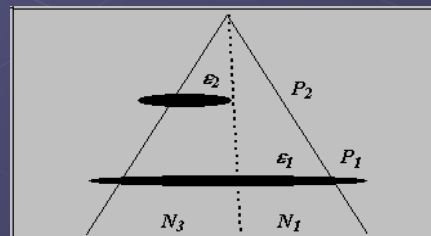
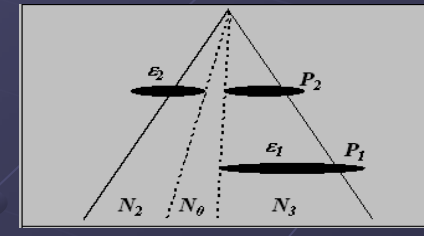
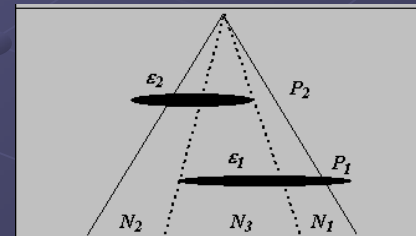
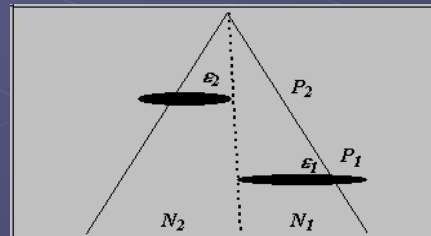
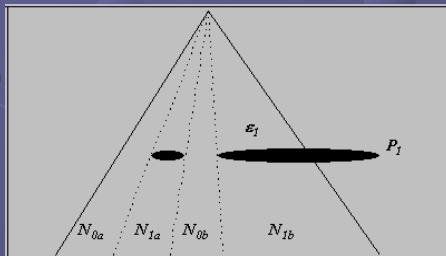
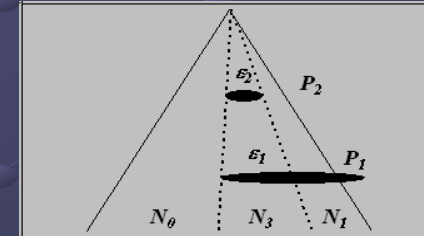
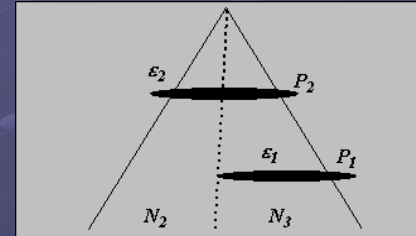
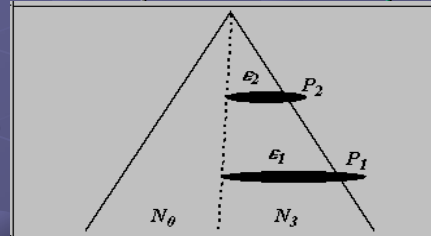
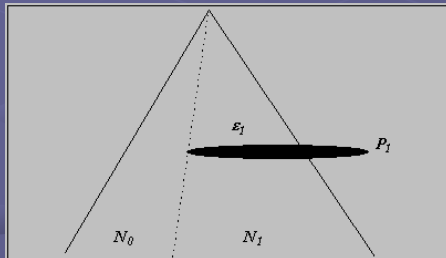


# Limitation of the Plane-Parallel Radiative Transfer Equation

- The plane-parallel radiative transfer models (e.g. DISORT, SBDART) can simulate the following **overcast** cloudy atmospheres:



but **NOT** the following atmospheres with **partial cloud covers** and/or **broken clouds**:



- Again, a generalized radiative transfer equation (RTE) for multilayer clouds is desired !

# Generalized RTE for the $M$ -Layer Cloud System

- We are developing a multilayer cloudy forward model which is not too complicated that it makes the cloudy inverse problem unmanageable, while generalized enough to include multilayer clouds.
- For a nonscattering atmosphere with  $M$ -layer clouds at most, a sensor's FOV has up to  $2^M$  sub-FOVs. We showed that the observed radiance can be described by:

$$R_{obs} = \sum_{K=0}^{2^M-1} N_K \sum_{i=0}^M \prod_{j=i+1}^{M+1} (1 - k_j \varepsilon_j) k_i \varepsilon_i R_i$$

with

$$R_i = B_\nu [T_c(p_i)] \tau_\nu(p_i) + \int_{p_i}^0 B_\nu [T(p)] d\tau_\nu(p),$$

$$\sum_{K=0}^{2^M-1} N_K = 1,$$

$$K = [k_M k_{M-1} \cdots k_1]_2,$$

where  $R_i$  is the radiance from the  $i$ -th layer cloud (as if it were opaque) and the atmosphere above it,  $N_K$  is the FOV fraction corresponding to the  $k$ -th sub-FOV. If an  $i$ -th layer cloud exists within a sub-FOV, then  $k_i=1$ , otherwise  $k_i=0$ .

## Example 1: The Generalized RTE for 1-Layer Cloud System.

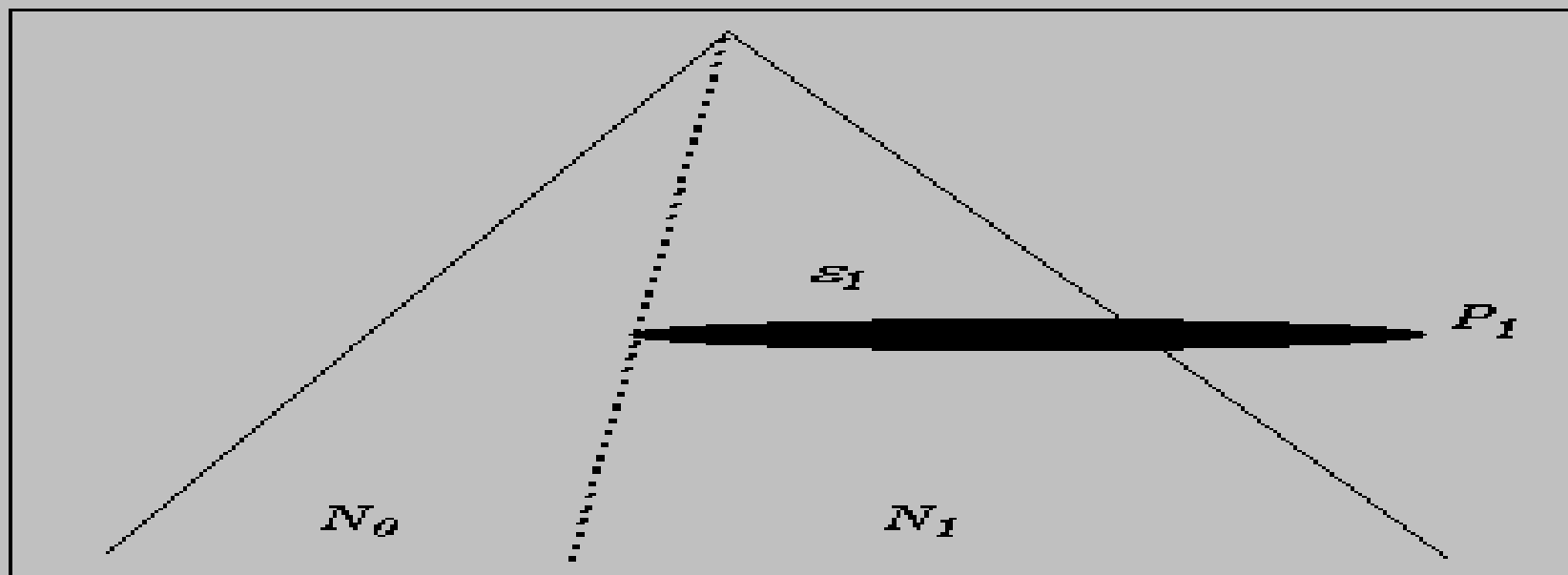


Figure 2. The generalized one-level cloud system with two sub-FOVs.

$$\begin{aligned} R_{\text{obs}} &= N_0 R_0 + N_1 \left[ (1 - \varepsilon_1) R_0 + \varepsilon_1 R_1 \right] \\ &= (1 - N_1 \varepsilon_1) R_0 + N_1 \varepsilon_1 R_1. \end{aligned}$$

When applied to two adjacent FOVs, it yields the  $N^*$  method for cloud clearing.

When applied to two close  $\text{CO}_2$  channels, it yields the  $\text{CO}_2$ -slicing method for cloud top pressure retrieval.

## Example 2: The Generalized RTE for 2-Layer Cloud System.

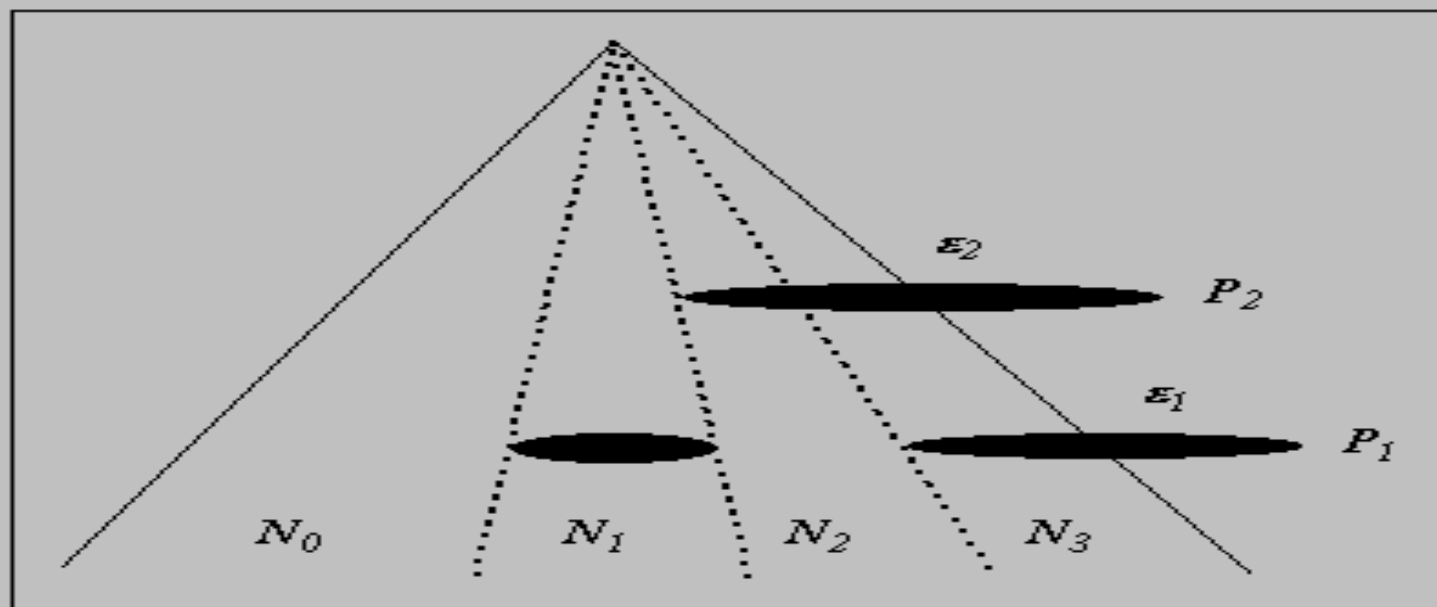


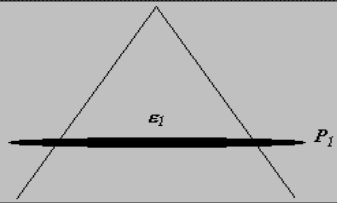
Figure 3. The generalized two-level cloud system with four sub-FOVs.

$$\begin{aligned} R_{\text{obs}} = & \left[ N_0 + N_1 (1 - \varepsilon_1) + N_2 (1 - \varepsilon_2) + N_3 (1 - \varepsilon_1) (1 - \varepsilon_2) \right] R_0 \\ & + \left[ N_1 \varepsilon_1 + N_3 (1 - \varepsilon_2) \varepsilon_1 \right] R_1 \\ & + (N_2 \varepsilon_2 + N_3 \varepsilon_2) R_2. \end{aligned}$$

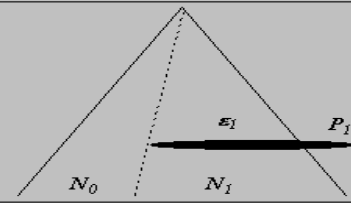
Both the  $N^*$  and  $\text{CO}_2$ -slicing methods are not applicable to a system with multilayer clouds!



## 2 ways to form a one-layer cloud system:

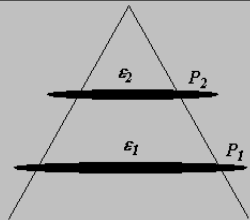


$$R_{obs} = (1 - \epsilon_1) R_0 + \epsilon_1 R_1$$

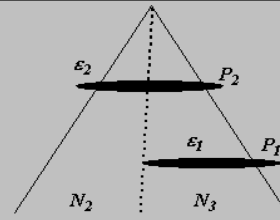


$$R_{obs} = (1 - N_1 \epsilon_1) R_0 + N_1 \epsilon_1 R_1$$

## 10 ways to form a two-layer cloud system:

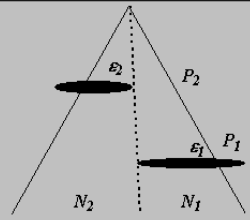


$$R_{obs} = (1 - \epsilon_1 - \epsilon_2 + \epsilon_1 \epsilon_2) R_0 + \epsilon_1 (1 - \epsilon_2) R_1 + \epsilon_2 R_2,$$



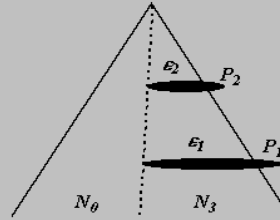
$$R_{obs} = [1 - N_2 \epsilon_2 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + N_3 \epsilon_1 (1 - \epsilon_2) R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_2 + N_3 = 1.$$



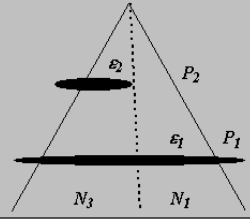
$$R_{obs} = (1 - N_1 \epsilon_1 - N_2 \epsilon_2) R_0 + N_1 \epsilon_1 R_1 + N_2 \epsilon_2 R_2,$$

$$N_1 + N_2 = 1$$



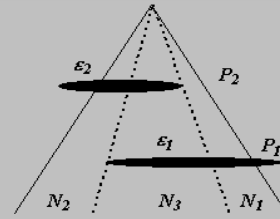
$$R_{obs} = [1 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + N_3 \epsilon_1 (1 - \epsilon_2) R_1 + N_3 \epsilon_2 R_2,$$

$$N_0 + N_3 = 1.$$



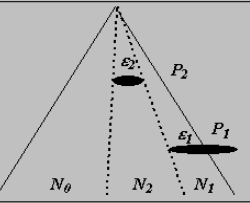
$$R_{obs} = [1 - N_1 \epsilon_1 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + [N_1 \epsilon_1 + N_3 \epsilon_1 (1 - \epsilon_2)] R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_1 + N_3 = 1.$$



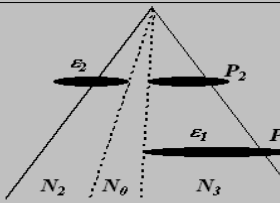
$$R_{obs} = [1 - N_1 \epsilon_1 - N_2 \epsilon_2 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + [N_1 \epsilon_1 + N_3 \epsilon_1 (1 - \epsilon_2)] R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_1 + N_2 + N_3 = 1.$$



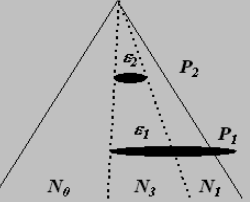
$$R_{obs} = (1 - N_1 \epsilon_1 - N_2 \epsilon_2) R_0 + N_1 \epsilon_1 R_1 + N_2 \epsilon_2 R_2$$

$$N_0 + N_1 + N_2 = 1$$



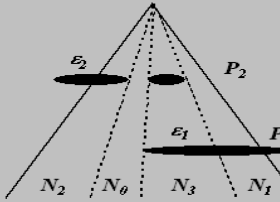
$$R_{obs} = [1 - N_2 \epsilon_2 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + (N_3 \epsilon_1 (1 - \epsilon_2)) R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_0 + N_2 + N_3 = 1.$$



$$R_{obs} = [1 - N_2 \epsilon_2 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + [N_3 \epsilon_1 (1 - \epsilon_2)] R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_0 + N_1 + N_3 = 1.$$



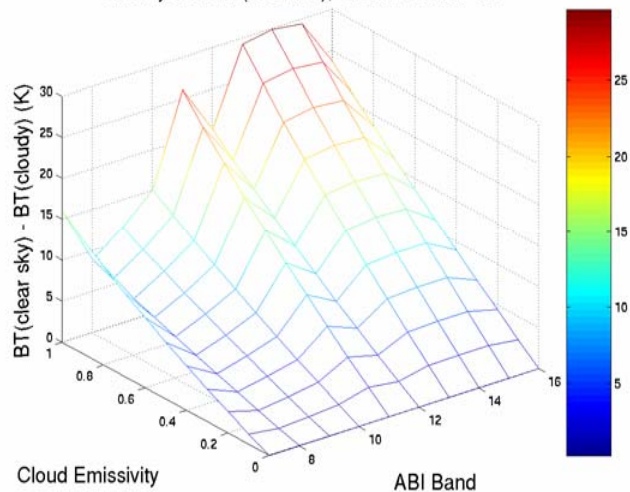
$$R_{obs} = [1 - N_1 \epsilon_1 - N_2 \epsilon_2 - N_3 (\epsilon_1 + \epsilon_2 - \epsilon_1 \epsilon_2)] R_0 + [N_1 \epsilon_1 + N_3 \epsilon_1 (1 - \epsilon_2)] R_1 + (N_2 \epsilon_2 + N_3 \epsilon_2) R_2,$$

$$N_0 + N_1 + N_2 + N_3 = 1.$$

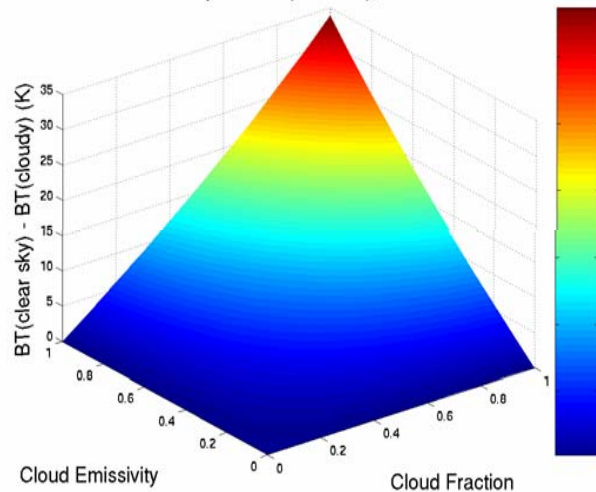
# GOES-R ABI Multilayer Cloudy Forward Model

## One-layer cloud system studies

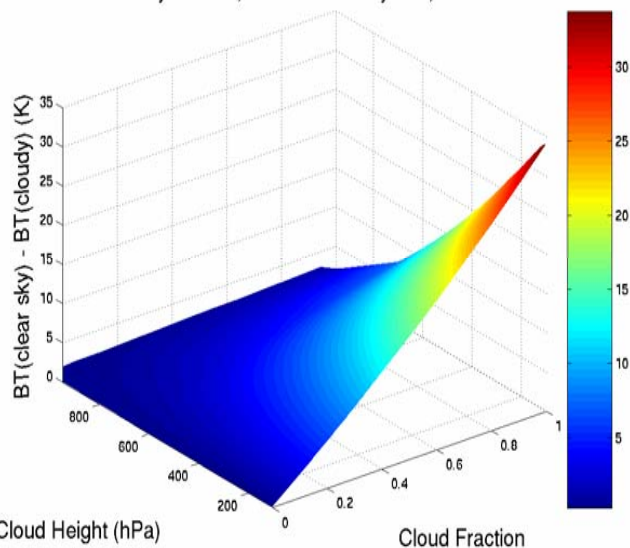
Difference from clear sky BT (Tropical)  
One layer cloud (200 hPa), Cloud Fraction=0.5



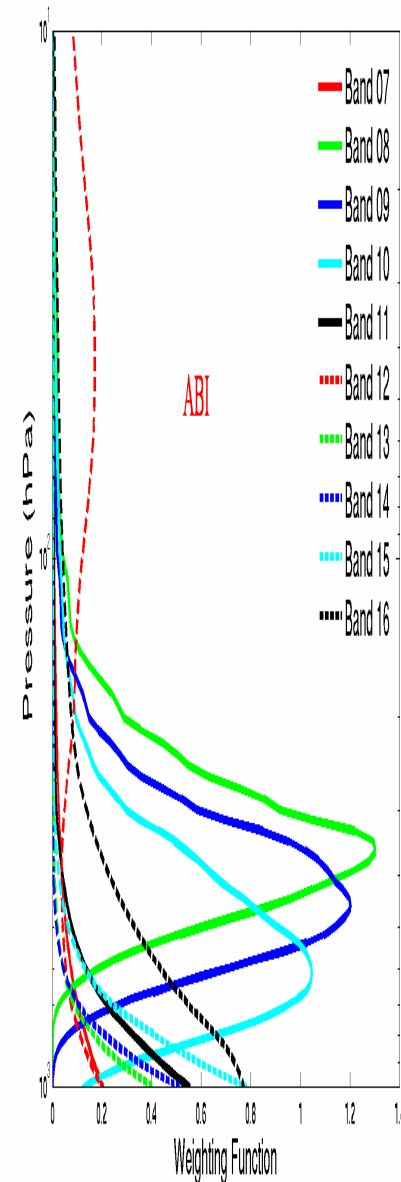
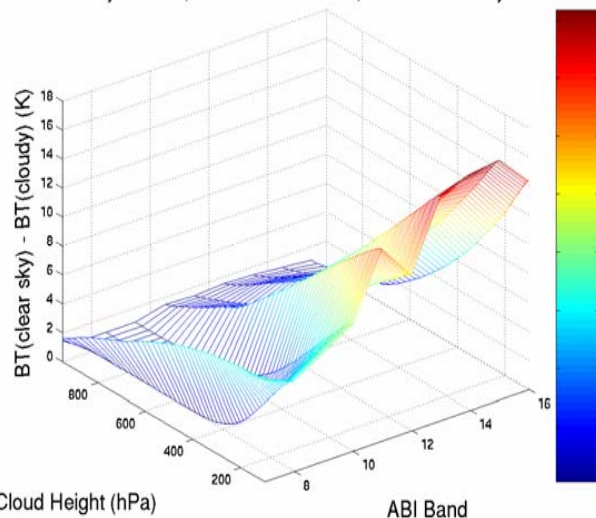
Difference from clear sky BT (Tropical)  
One layer cloud (500 hPa), Band 13



Difference from clear sky BT (Tropical)  
One layer cloud, Cloud Emissivity=0.5, Band 13



Difference from clear sky BT (Tropical)  
One layer cloud, Cloud Fraction=0.5, Cloud Emissivity=0.5

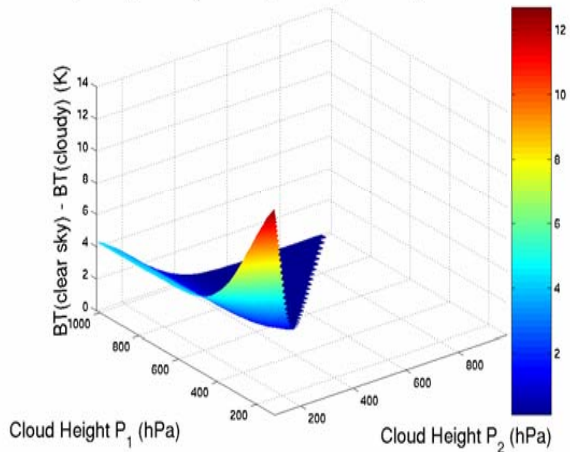


# ABI Multilayer Cloudy Forward Model

## Two-layer cloud system studies

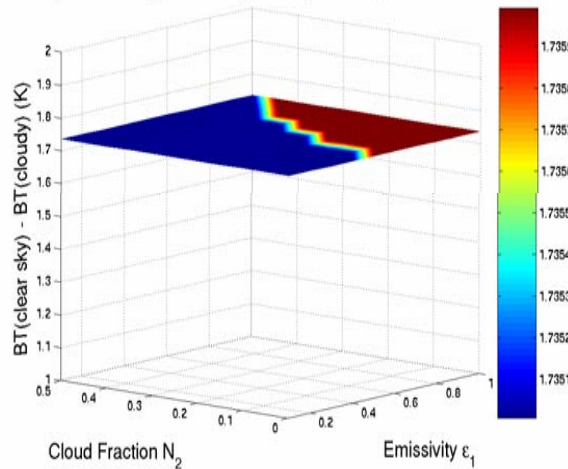
Difference from clear sky BT (Tropical)

$\epsilon_1=0.6, \epsilon_2=0.3, N_0=0.25, N_1=0.25, N_2=0.25, N_3=0.25$ , Band 09



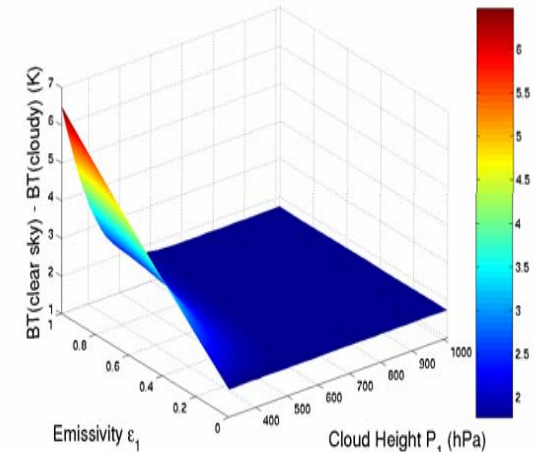
Difference from clear sky BT (Tropical)

$P_1=700\text{hPa}, P_2=300\text{hPa}, \epsilon_2=0.3, N_0=0.25, N_1=0.25$ , Band 09



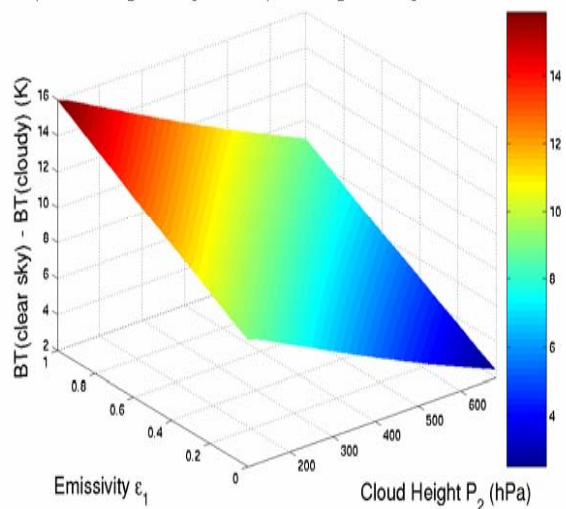
Difference from clear sky BT (Tropical)

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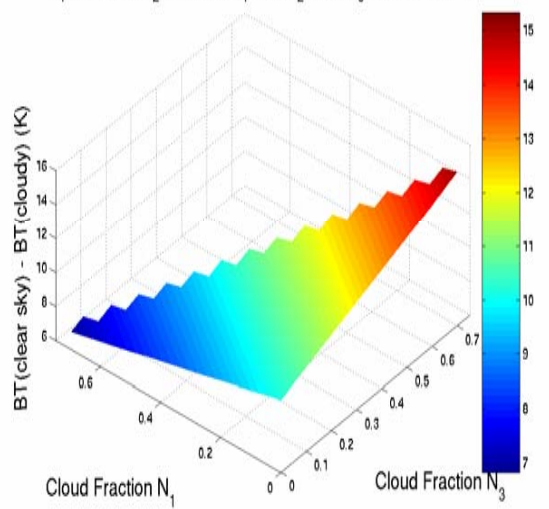
Difference from clear sky BT (Tropical)

$P_1=700\text{hPa}, \epsilon_2=0.3, N_0=0.25, N_1=0.25, N_2=0.25, N_3=0.25$ , Band 13



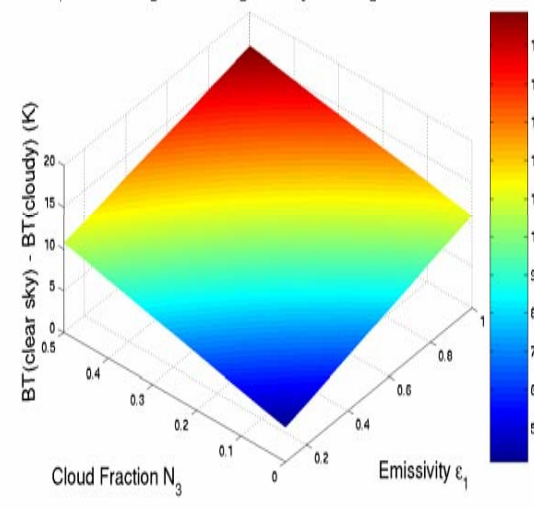
Difference from clear sky BT (Tropical)

$P_1=700\text{hPa}, P_2=300\text{hPa}, \epsilon_1=0.6, \epsilon_2=0.3, N_0=0.25$ , Band 13

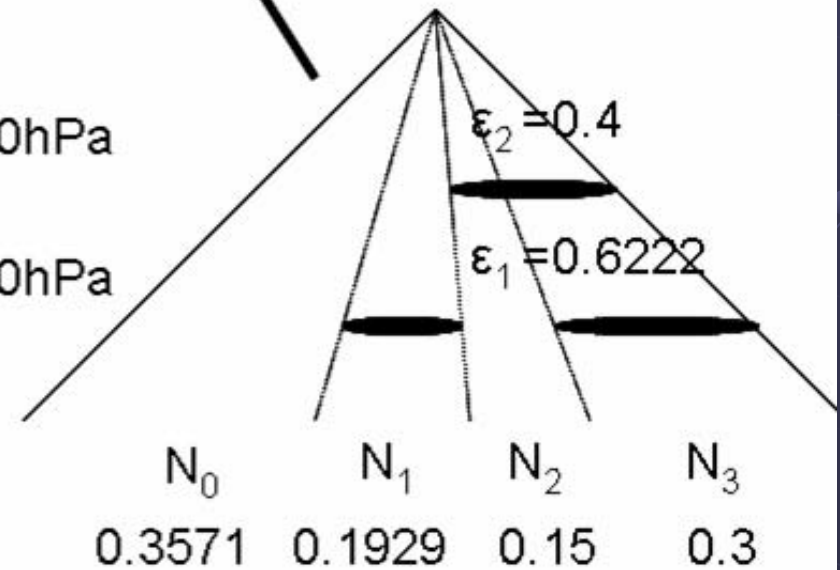
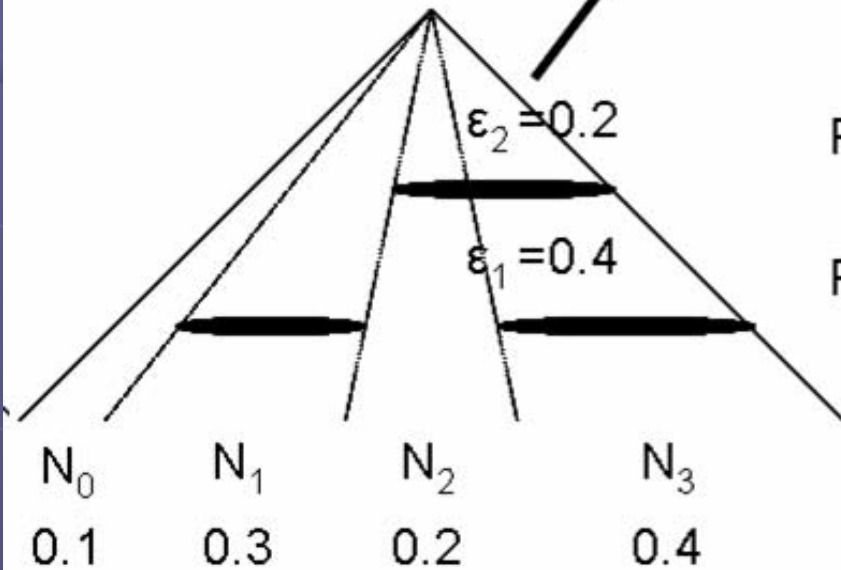
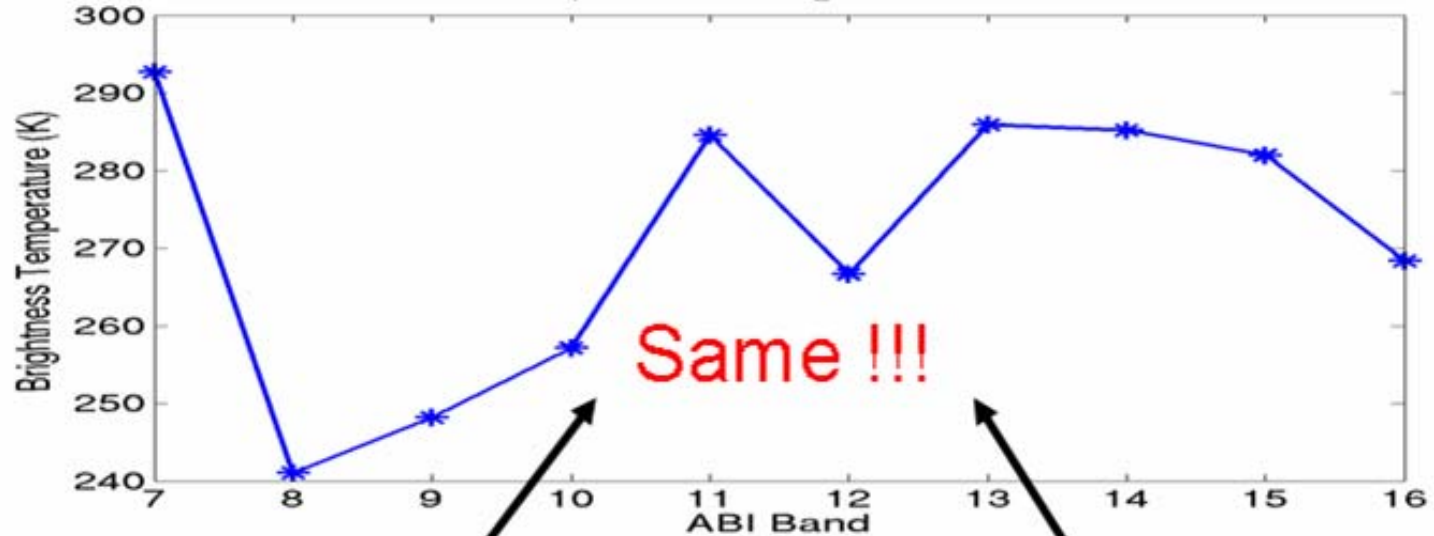


Difference from clear sky BT (Tropical)

$P_1=700\text{hPa}, P_2=300\text{hPa}, \epsilon_2=0.3, N_0=0.25, N_2=0.25$ , Band 13



# Multiple Solutions Exist for the Multilayer Cloudy Retrieval!



# Summary

- The generalized radiative transfer equation for multilayer clouds is developed.
- The clear-sky atmosphere is its special case when cloud fractions are zero.
- Both the  $N^*$  and  $\text{CO}_2$ -slicing methods are not applicable to multilayer cloud cases.
- The GOES-R ABI multilayer cloudy forward model is implemented.
- The ABI case studies show some correlations among cloud parameters.

# Future Work

➤ Implementation of the multilayer cloudy forward model for hyperspectral sounders (e.g. IASI, CrIS, AIRS)

➤ Multilayer cloudy retrieval for the multispectral sensors (e.g. ABI).

*Not enough bands? Can be done in a “MOPPIT” way, i.e. atmospheric temperature and moisture profiles are supplied from the weather forecast model.*

*Only retrieve cloud parameters with some inter-correlations in mind for parameterized simplification.*

➤ Multilayer cloudy retrieval for the hyperspectral sensors.

*Much easier with thousands of channels for simultaneous retrieval of atmospheric variables and cloudy parameters!*