

# **Extraction of Profile Information** **from Cloud Contaminated Radiances**

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*ECMWF Workshop on Assimilation of High Resolution Sounders in NWP (June 28 – July 1, 2004)*

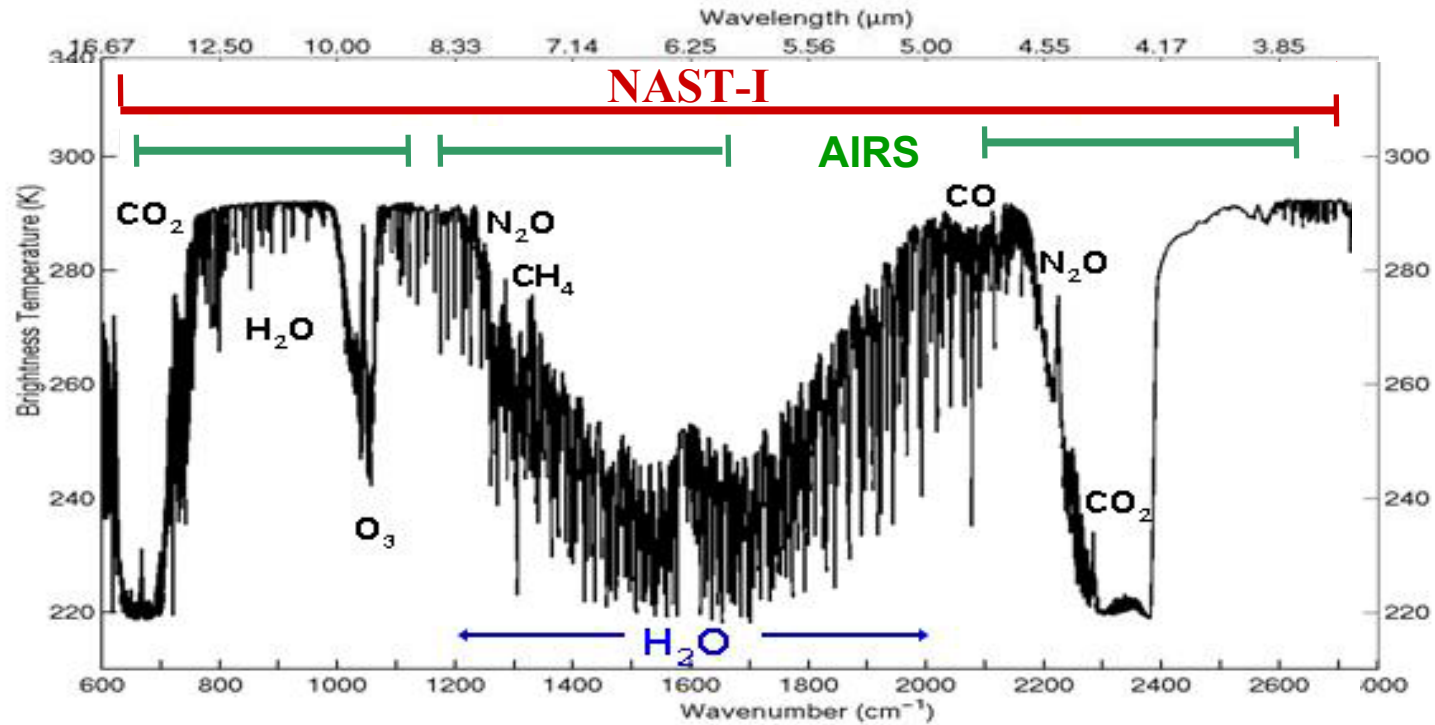


***Isabel Pays Unwelcome Visit To Seaford VA***

***The 24-36 hour track forecast was good  
but the surge was missed by >1 meter***

***Can Hyerspectral Soundings Improve This!***

# NAST-I & AIRS Measurement Characteristics



## Satellite AIRS ( IR Grating Spectrometer)

**Spectral Range: 3.7 – 15.4 Microns**  
**Spectral Res:  $\nu/\delta\nu = 1200$  (0.5-2.25 cm<sup>-1</sup>)**  
**Ground Resolution: 13.5km @ nadir**  
**Swath Width: 1650 km**

## Aircraft NAST-I ( IR Interferometer)

**Spectral Range: 3.5 - 16 Microns**  
**Spectral Res:  $\delta\nu = 0.25$  cm<sup>-1</sup>**  
**Ground Resolution: 2.5 km @ 20 km**  
**Swath Width: 40 km @ 20 km**

# *Empirical Orthogonal Function (EOF)*

## *NAST-I Regression Retrieval*

For clear sky and opaque cloud:

$$R = \varepsilon_{s,c} B_{s,c} \tau_{s,c} - \int_{P_{ac}}^{P_{s,c}} B d\tau - (1 - \varepsilon_{s,c}) \tau_{s,c} \int_{P_{s,c}}^0 B d\tau^*$$

*Radiance EOF*  
*Amplitudes*

$$C_i = \sum_{j=1}^{nc} R_j E_{ji}$$

$$\left. \begin{matrix} T_s, \\ \varepsilon_s(v), \\ T(p), \\ Q(p) \end{matrix} \right\} = \sum_{i=1}^{n-1} K_{mi} C_i + K_{mn} P_s \quad \underline{\underline{Retrieval Solution}}$$

R = radiance

$\varepsilon_{s,c}$  = surface or cloud emissivity

$B_{s,c}$  = surface or cloud Planck radiance

$\tau$  = transmittance between aircraft and atmospheric Pressure level (P)

$\tau_{s,c}$  = atmospheric transmittance between aircraft and surface or cloud ( $P_{s,c}$ )

$\tau^*$  = atmospheric transmittance between surface or cloud P and aircraft

$P_{ac}$  = aircraft pressure,  $P_s$  = surface pressure

$\mathfrak{R}$  = radiance

E = radiance covariance EOFs

C = radiance EOF amplitudes

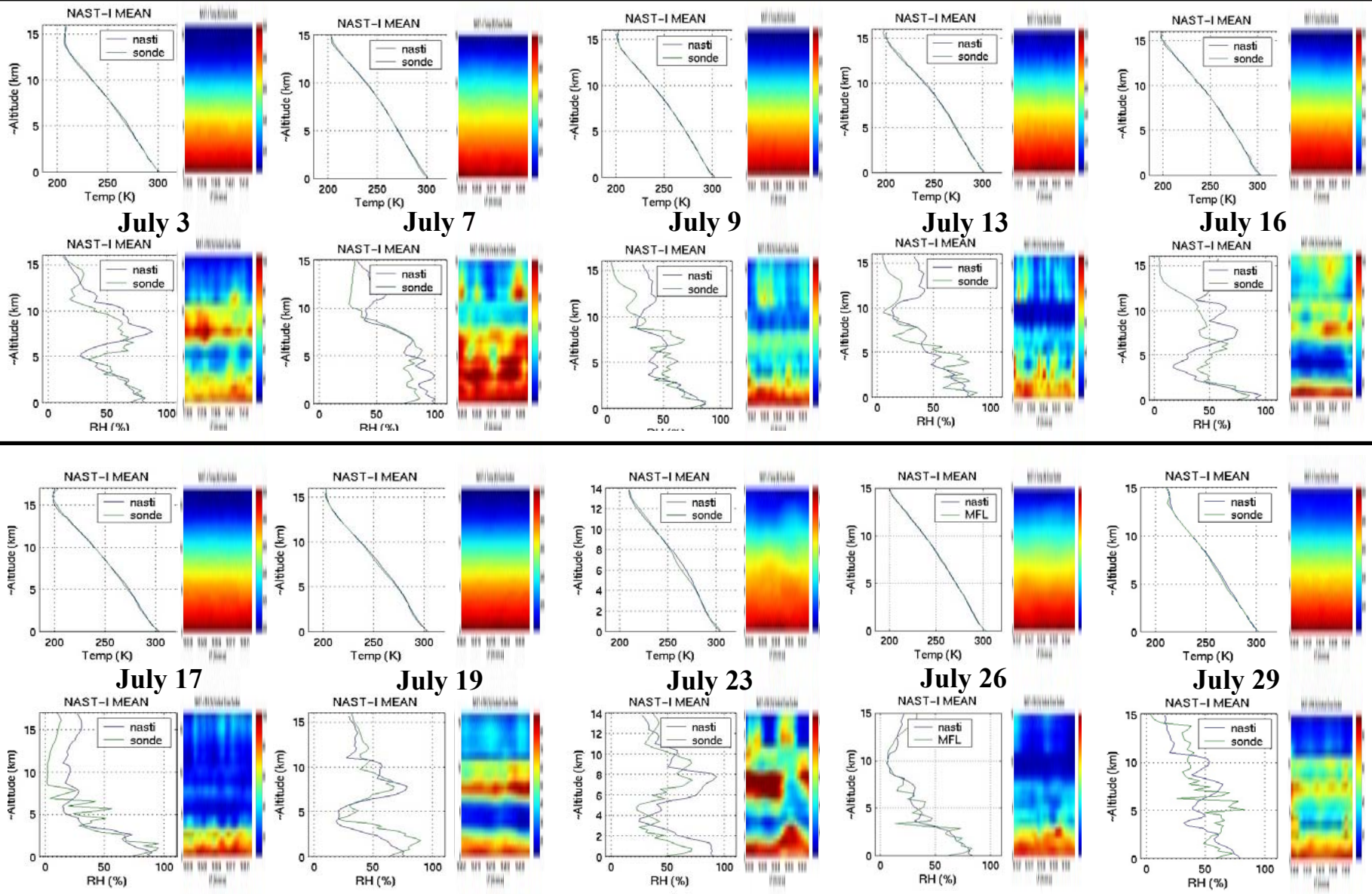
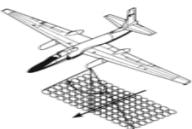
T = temperature

Q = H<sub>2</sub>O mixing ratio

K = regression coefficients

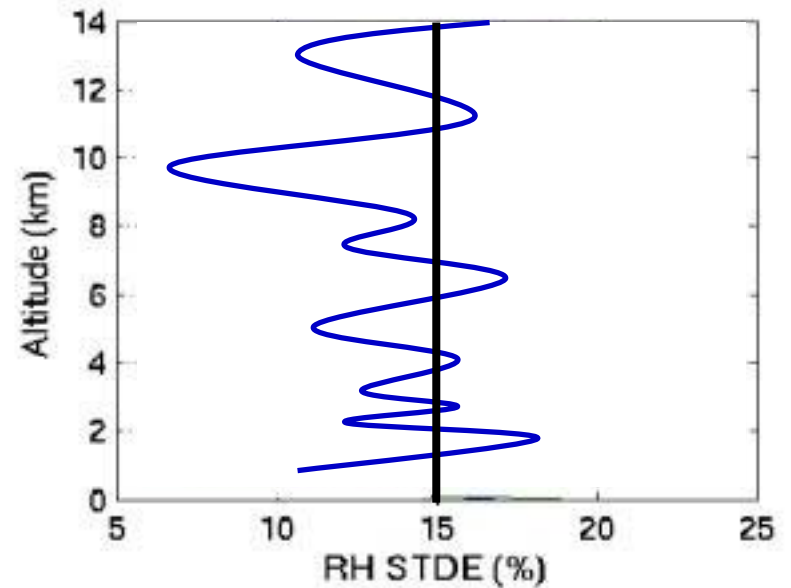
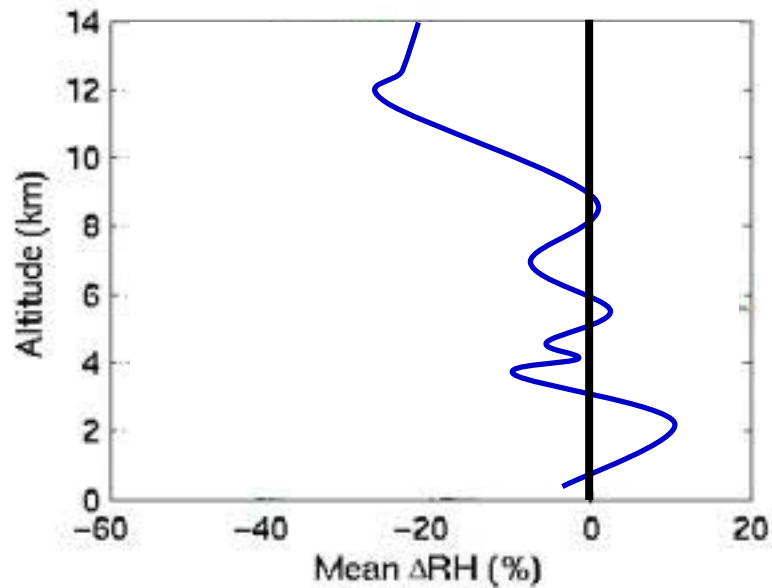
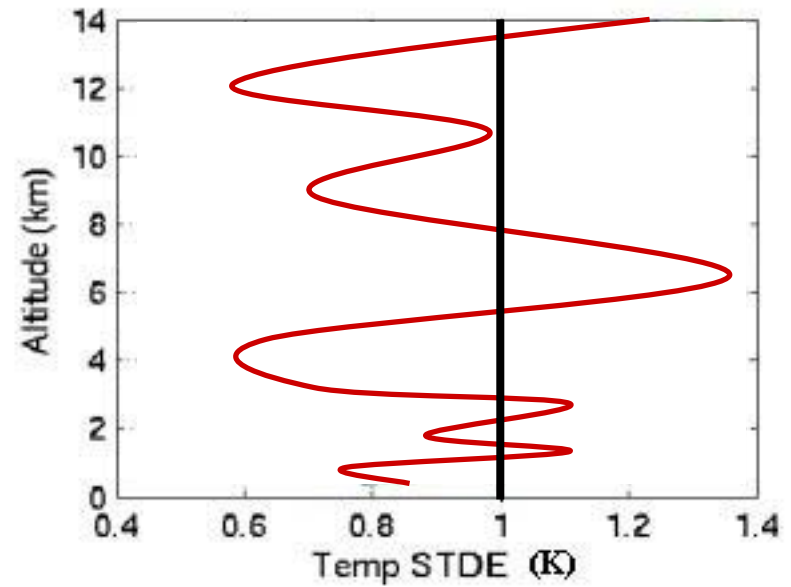
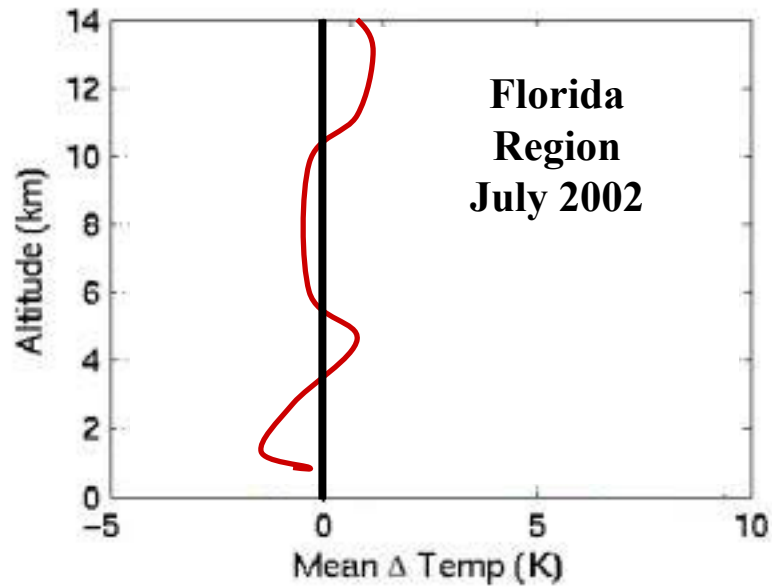
- **Physical Regression – EOFs and regression training based on calculated radiances**
- **Training should include cloud, sfc. emissivity, skin temp, and solar variability**
- **Null radiance errors assumed for PC specification and regression training**
- **EOF # selected by spatial radiance RMSD (observed minus retrieval) minimization**

# C-F\* (July, 2002) NAST-I Vs Radiosondes



\* Cirrus Regional Study of Tropical Anvils and Cirrus Layers - Florida Area Cirrus Experiment (CRYSTAL - FACE)

# C-F Retrieval Vs Raob Mean and Stde (Clear Cases)



# ***Approaches to Dealing With Clouds***

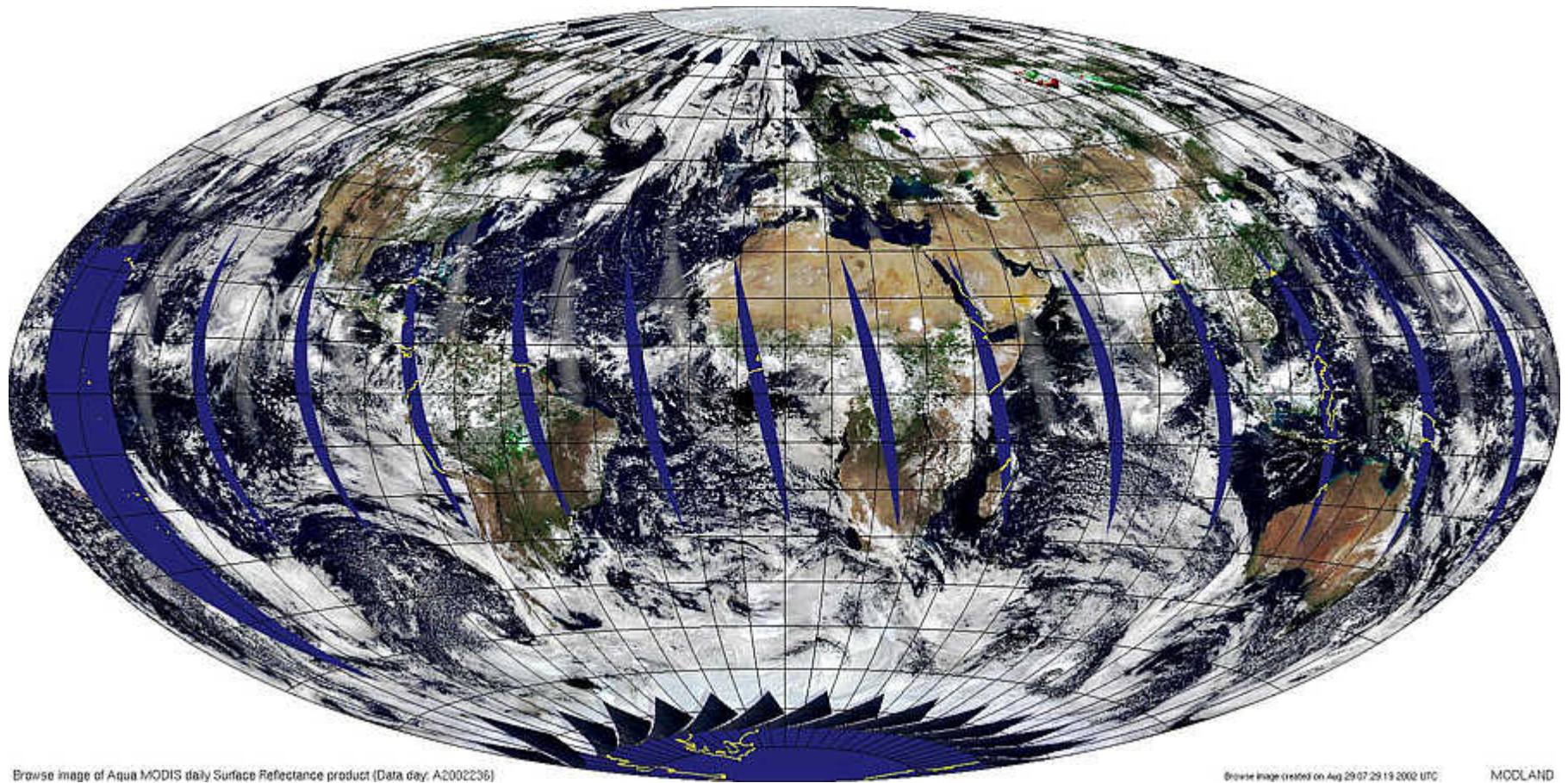
**Hole Hunting** - Requires small field of view. Produces soundings in clear IFOVs only.

**Cloud Clearing** - Provides sounding in clear air above and below broken clouds. Requires multi-spectral imager with broadband sounding channels to filter erroneous estimates. Results improve with decreasing field of view size.

**Cloud Equivalent Clear Radiance Retrieval** - Provides correct sounding down to near cloud top level with a erroneous sounding being produced below cloud level. Below an opaque overcast, an isothermal sounding results whereas for a semi-transparent or broken cloud condition, the sounding below the cloud will lie in-between the true sounding and the isothermal profile

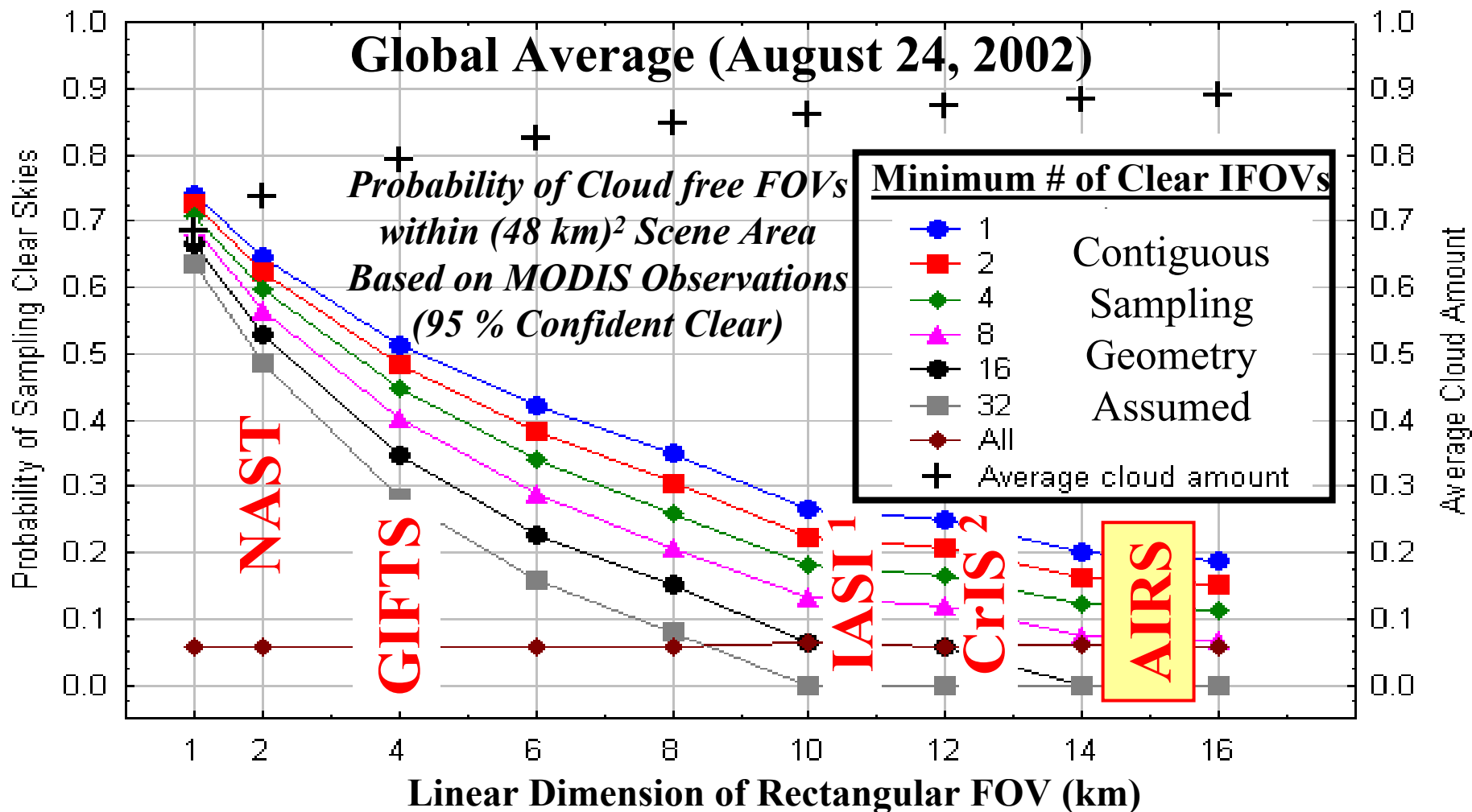
**Cloud-Training** - Provides sounding above and below semi-transparent and/or broken clouds, and above opaque overcast clouds. Enables cloud microphysical parameters to be retrieved for input to a physical/matrix inverse retrieval or the direct assimilation of radiances into the forecast model

*Spatial resolution is important for resolving clear radiances*



**MODIS True Color Image – 24 August, 2002**

# Hole Hunting - Requires small field of view



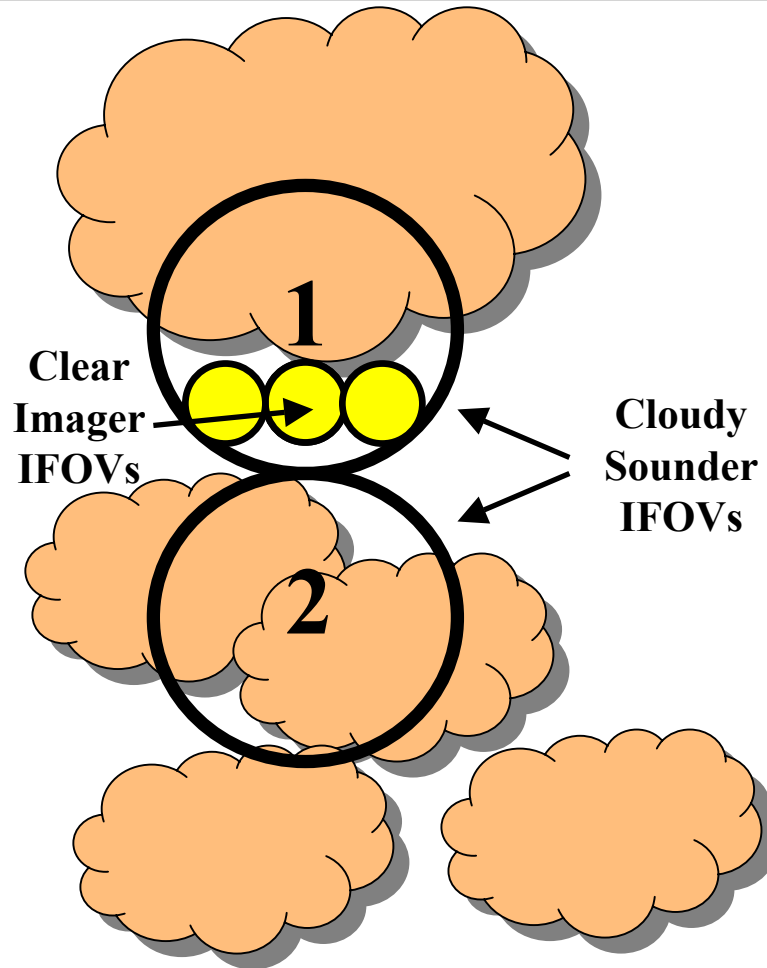
**We must be able to treat clouds in the retrieval !**

<sup>1</sup> IASI is circular with a diameter of 12 Km, <sup>2</sup> CrIS is circular with a diameter of 14 km



# Basic Cloud Clearing Methodology

(Assumes Horizontally Uniform Cloud Height and Cloud Microphysics)



$$R_{clr}(\nu) = \frac{R_1(\nu) - N^*(\nu)R_2(\nu)}{1 - N^*(\nu)}$$

where  $N^*(\nu) = \epsilon(\nu)_1 N_1 / \epsilon_2(\nu) N_2$ .

$$N^*(W) = \frac{R_1(W) - \overline{R_{clr}(\Delta W)}}{R_2(W) - \overline{R_{clr}(\Delta W)}}$$

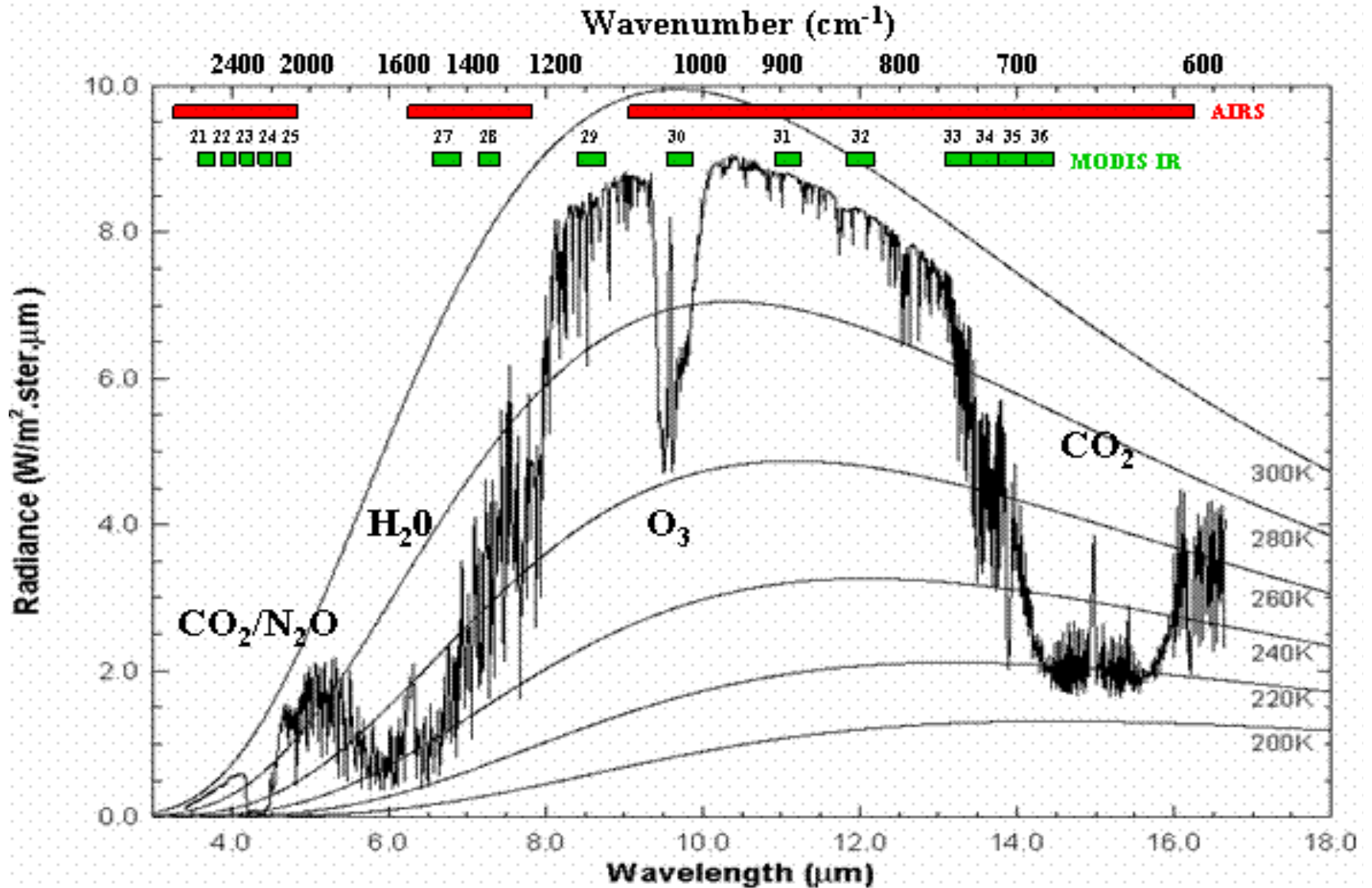
$$\hat{R}_{clr}(\Delta\nu) = \int \theta(\nu) R_{clr}(\nu) d\nu$$

**Filter:**

$$|\hat{R}_{clr}(\Delta\nu) - R_{clr}(\Delta\nu)| \geq \delta$$

$R_1(W)$  and  $R_2(W)$  are sounder window radiance measurements in FOVs 1 and 2.  $R_{clr}(\Delta W)$  is the clear window radiance measured by the imager.  $R_{clr}(\Delta\nu)$  is the clear radiance measured in the absorption channel(s) of the imager.  $\delta$  is the expected error, due to measurement noise, between the true and reconstructed imager clear radiances.

***Spectrum measured at AIRS spectral resolution ( $\delta\nu=v/1200\text{ cm}^{-1}$ ) with MODIS Infrared channels and AIRS sounding spectral bands shown***

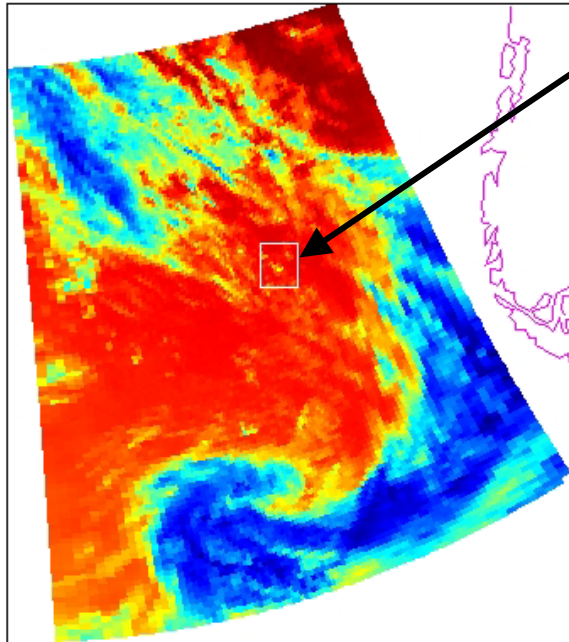


# An AIRS/MODIS Cloud-Clearing Example

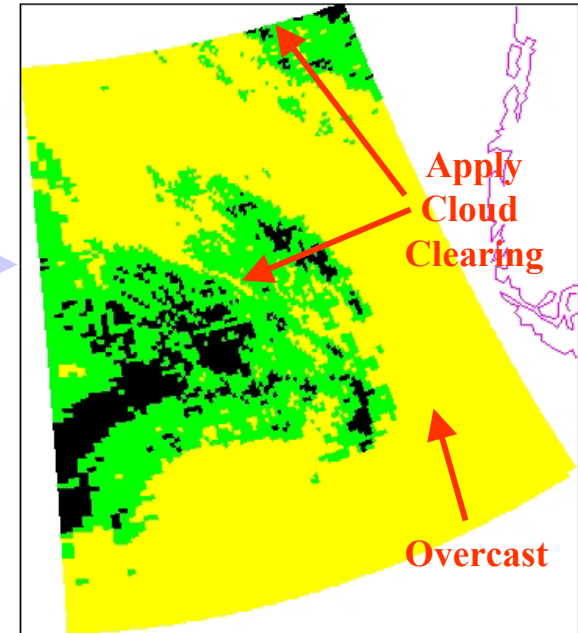
Feb.18, 2004, G203, 20:17 – 20:23 UTC, MODIS 20:15; 20:20

**Study area for cloud clearing**

AIRS Channel 763 [ 901.68  $\text{cm}^{-1}$ ] Brightness Temperature



AIRS Cloud Mask



230

240

250

260

270

280

clear

partly cloud

full cloud

AIRS BT(K)

**AIRS cloud detection from MODIS 1km cloud mask**

# AIRS Derived Clear Radiance Vs Clear Sky Neighbor

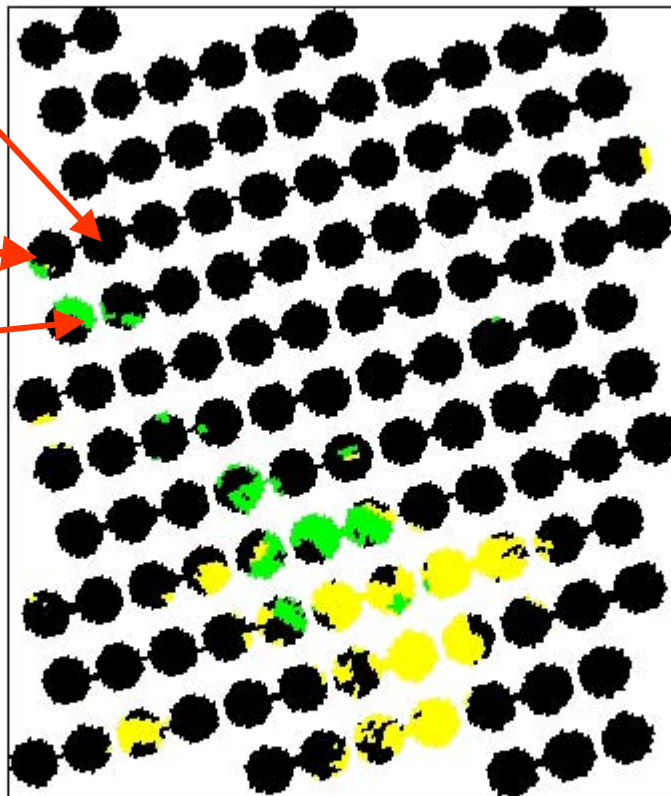
Clear  
neighbor for  
reference

Partly Cloudy FOV

(Line 74, column 55)

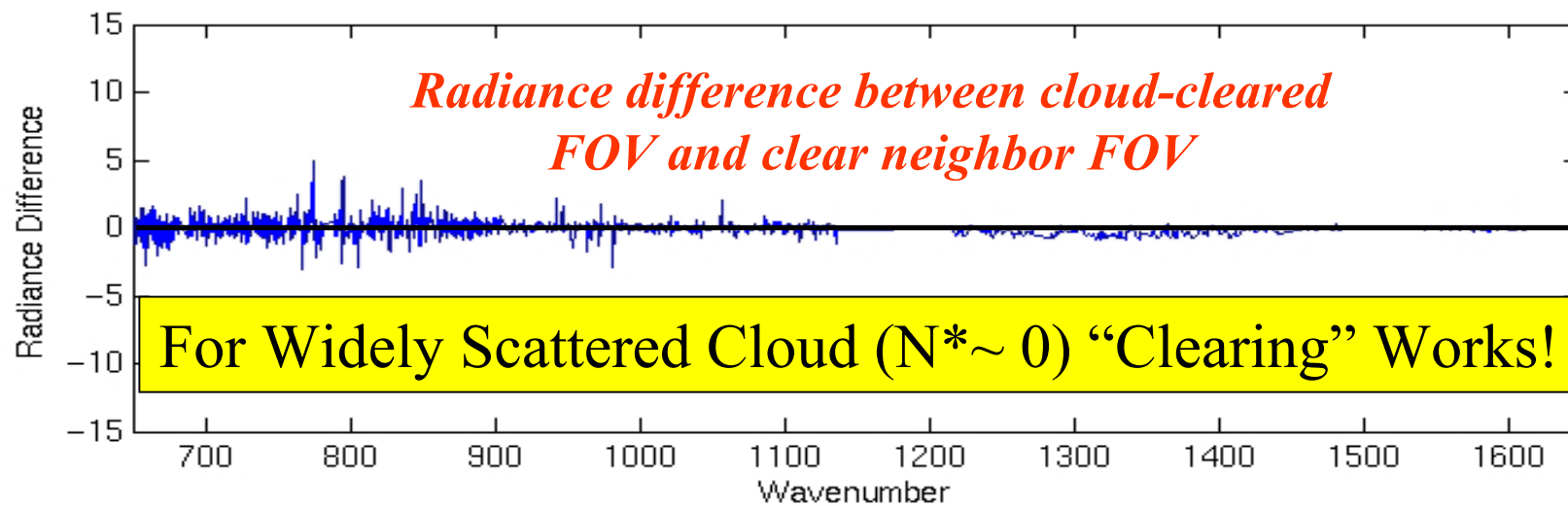
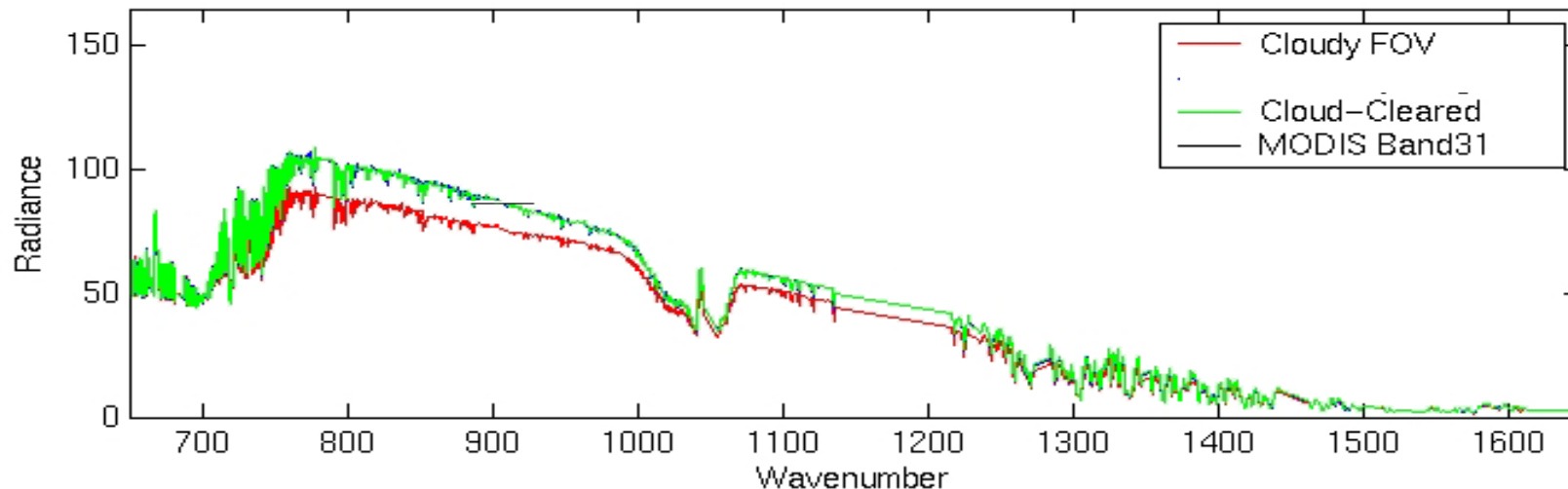
Partly Cloudy Neighbor

MODIS Classification Mask

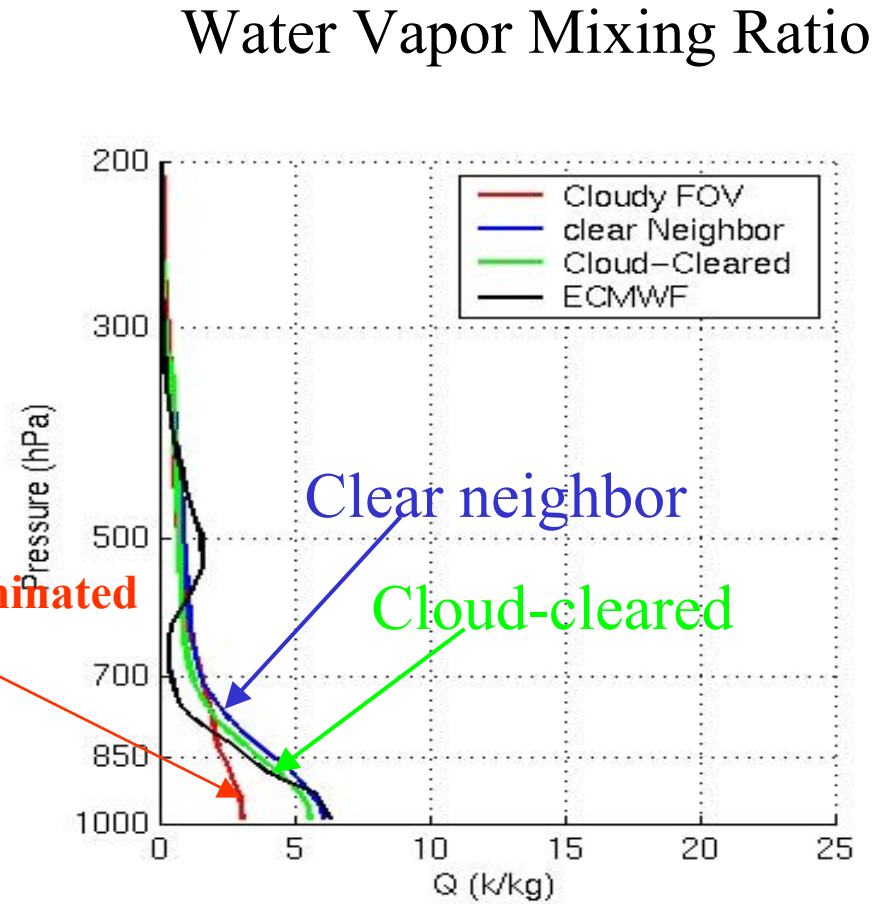
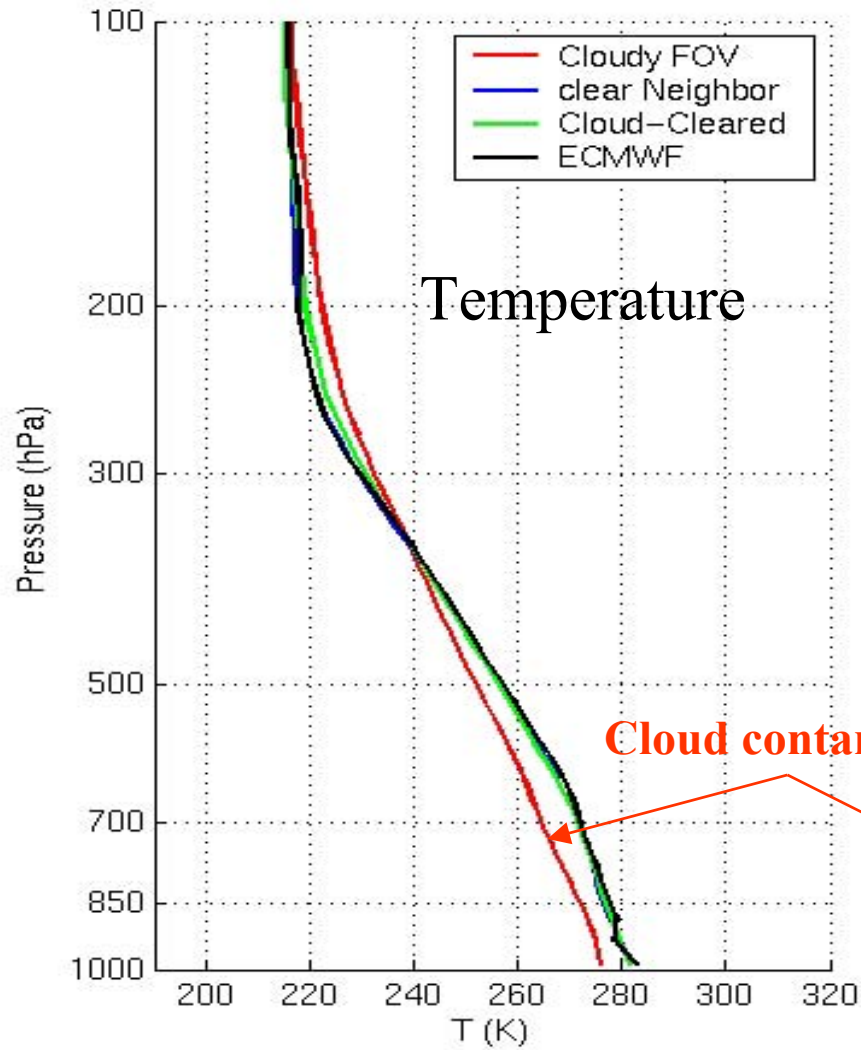


# AIRS Derived Clear Radiance Vs Clear Sky Neighbor

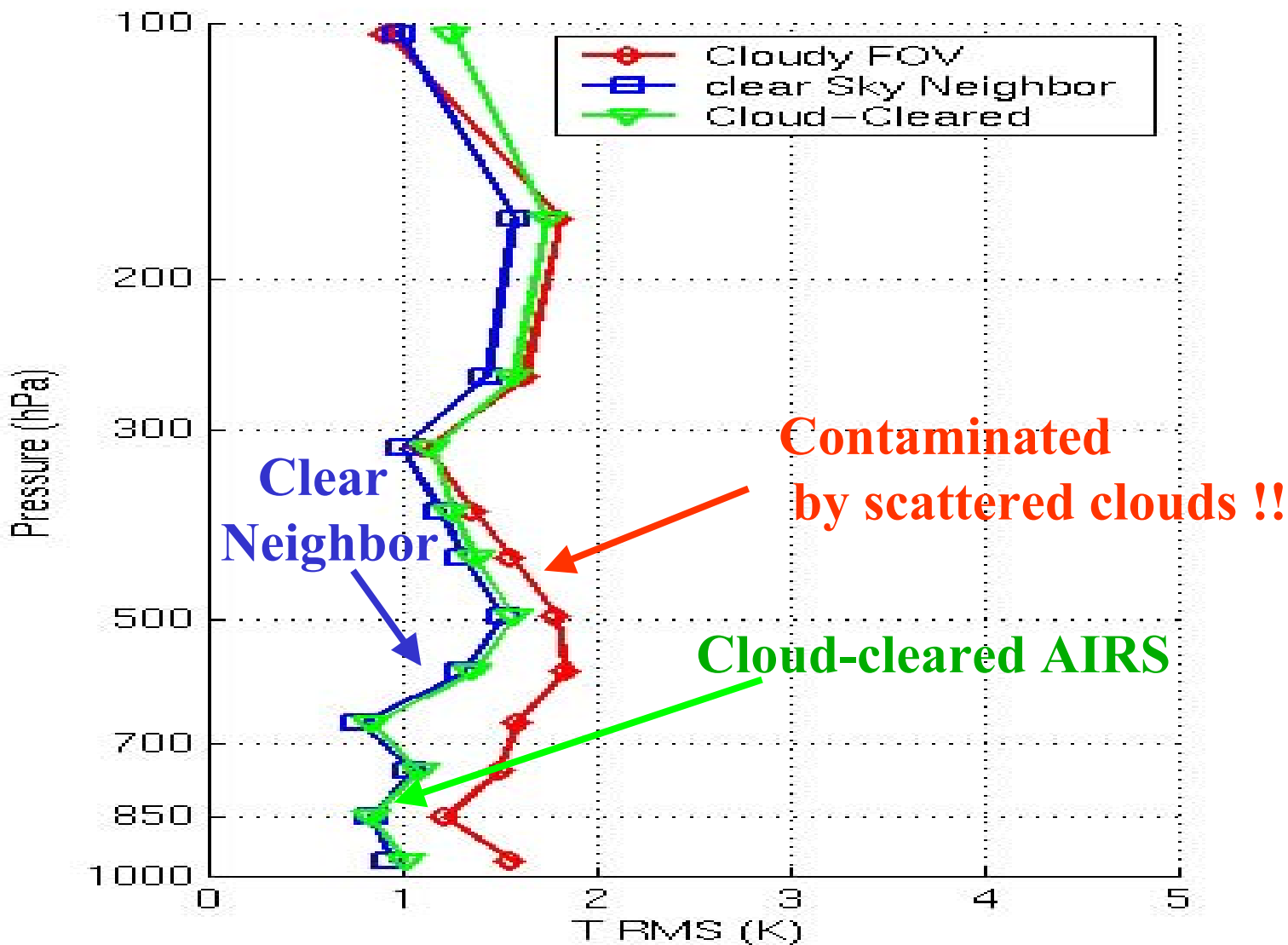
$N^* = 0.02$  Cloudy FOV:(55,74) Neighbor:(55,75) clear Sky Neighbor:(56,74)



# AIRS Profile Retrievals Vs ECMWF Analysis



# Entire Granule Temperature RMS Difference (250 cases) Between AIRS and ECMWF (Scattered Clouds)\*



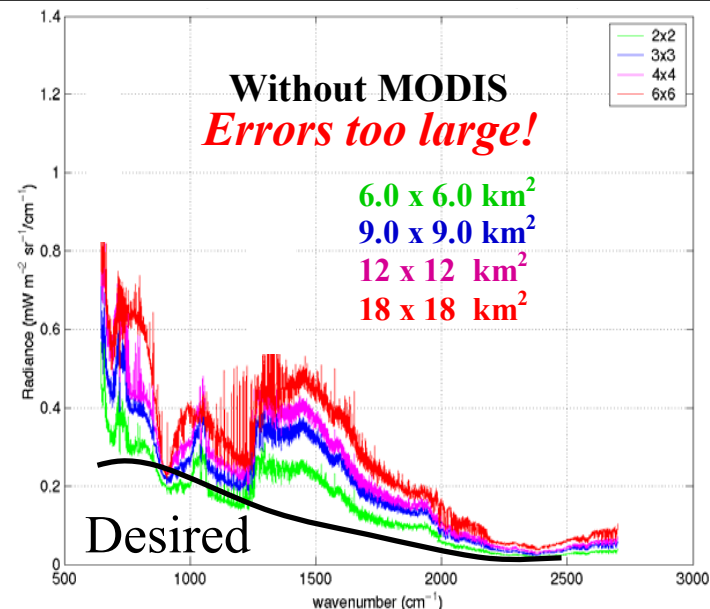
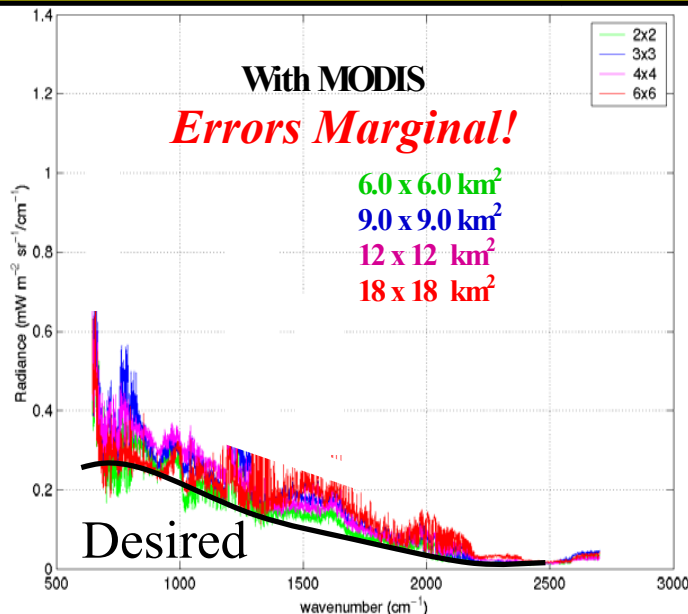
\* Jun Li (CIMSS, 2004)

# Cloud Clearing with/without MODIS Imaging Data

40 x 40 km Sounding Area Clear Column Radiance\* Yields (%)

Spatial Resolution	3km	6km	9km	12 km	18 km
Total Number of FOVs/ FOR	144	36	16	9	4
≥ 1 Observed Clear FOV/FOR (%)	46	40	33	28	21
Total (Clr + CCR) w/o MODIS (%)	66	62	56	53	45
Total with MODIS (%)	<b>64</b>	<b>58</b>	<b>52</b>	<b>47</b>	<b>39</b>

**< 50 % yield, at 40 km spacing, for 12 km sounding resolution  
 ∴ Need to perform cloudy retrievals for AIRS/IASI/CrIS !!**

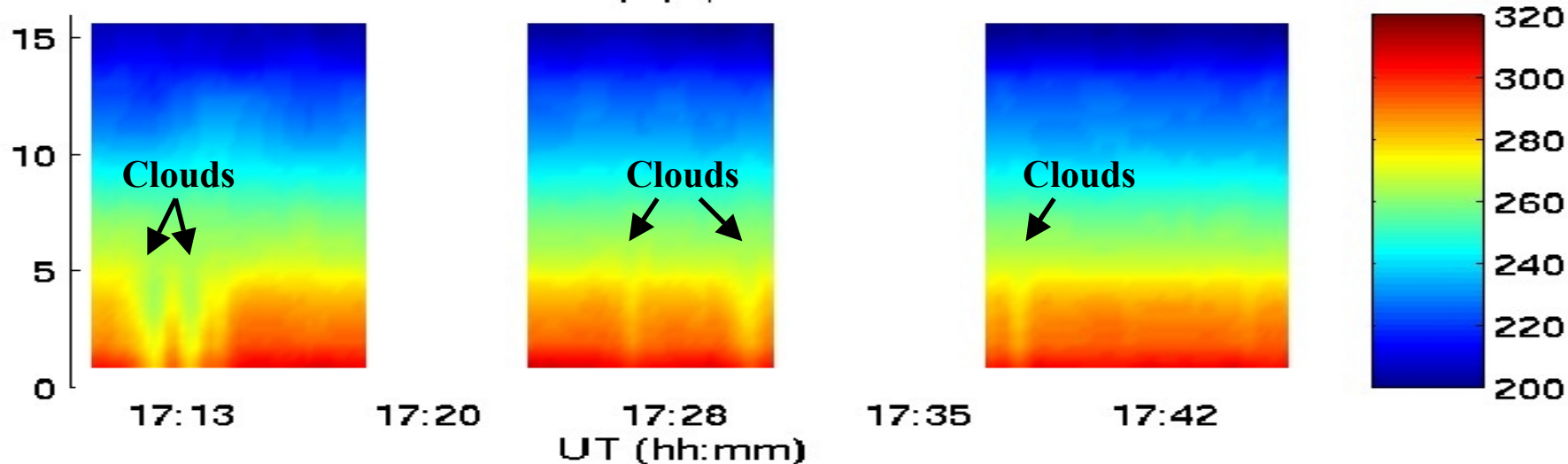


\*19 Different NAST-I Flights covering all season/all latitude cloud conditions



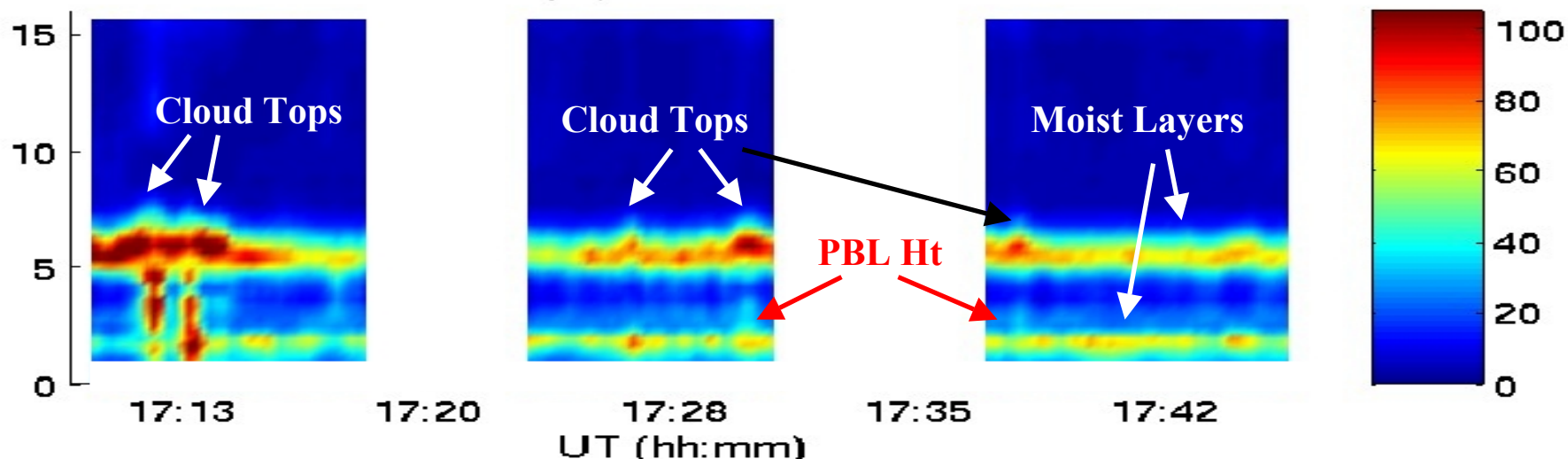
# *Cloud Equivalent Clear Radiance Retrieval*

NAST-I Temp (K) Cross Section



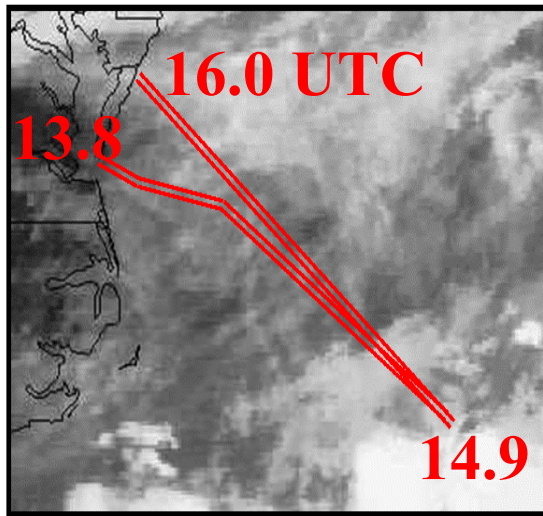
**NAST I-HOP June 12, 2002 Over Oklahoma**

NAST-I RH (%) Vertical Cross Section

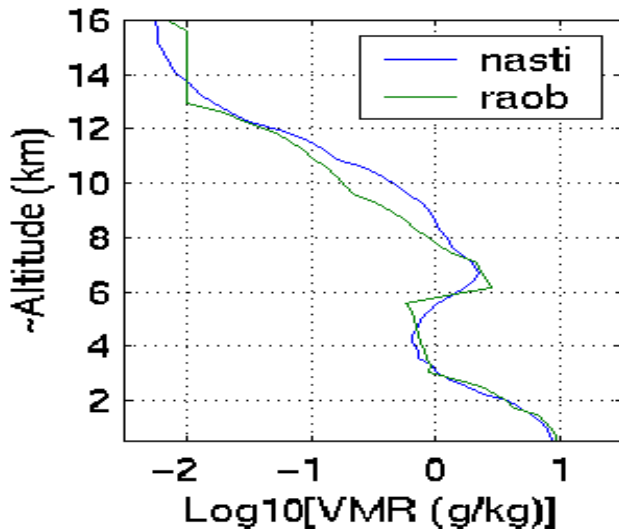


# *Cirrus Cloud “Venetian Blind Effect”*

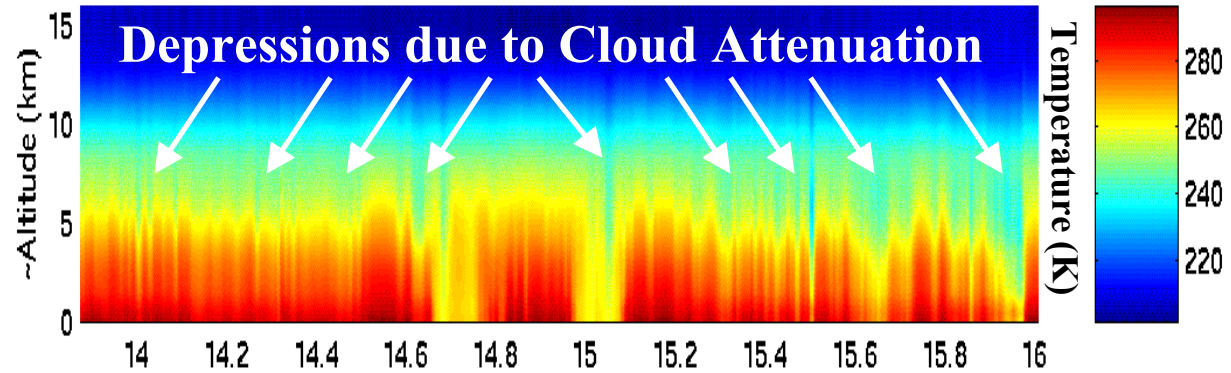
Proteus Flight Track (July 12, 2001)



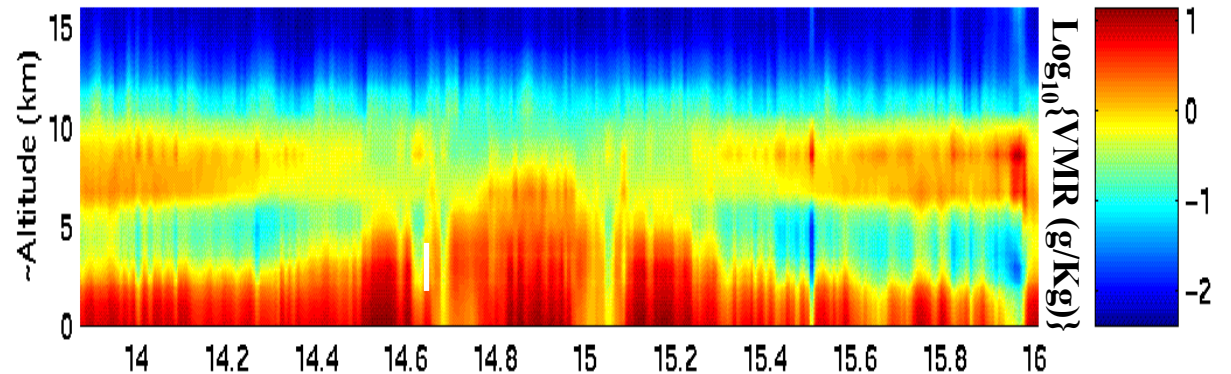
GOES ID /1515 GMT



NAST-I Temperature (K) Vertical Cross Section

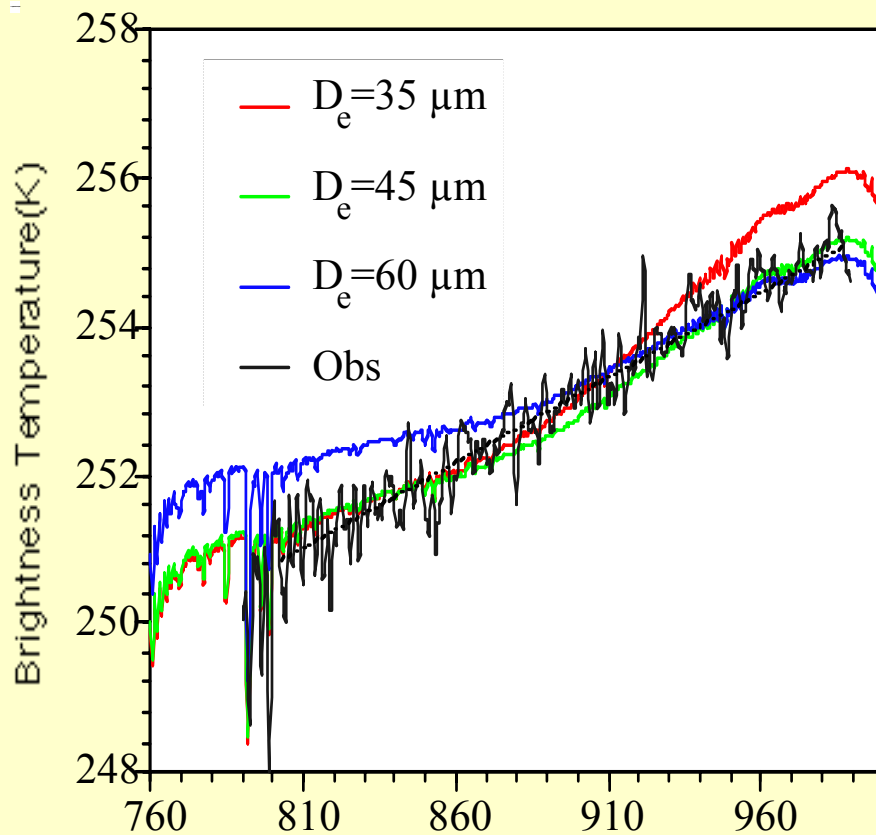


NAST-I Log<sub>10</sub>[VMR (g/kg)] Vertical Cross Section

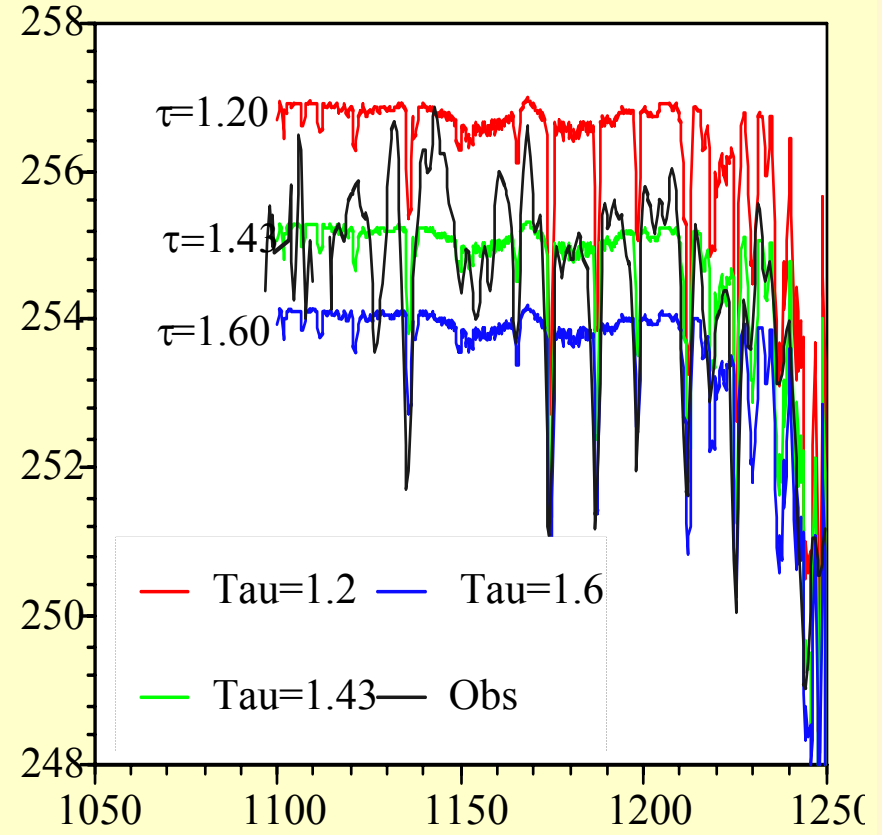


**These retrievals, uncorrected for cloud attenuation, demonstrate the ability of a high spatial resolution sounder to sense the spatial structure of moisture below a scattered and semi-transparent cirrus cloud cover**

# *Basis for Cloud Training Algorithm!*



Wavnumber ( $\text{cm}^{-1}$ )



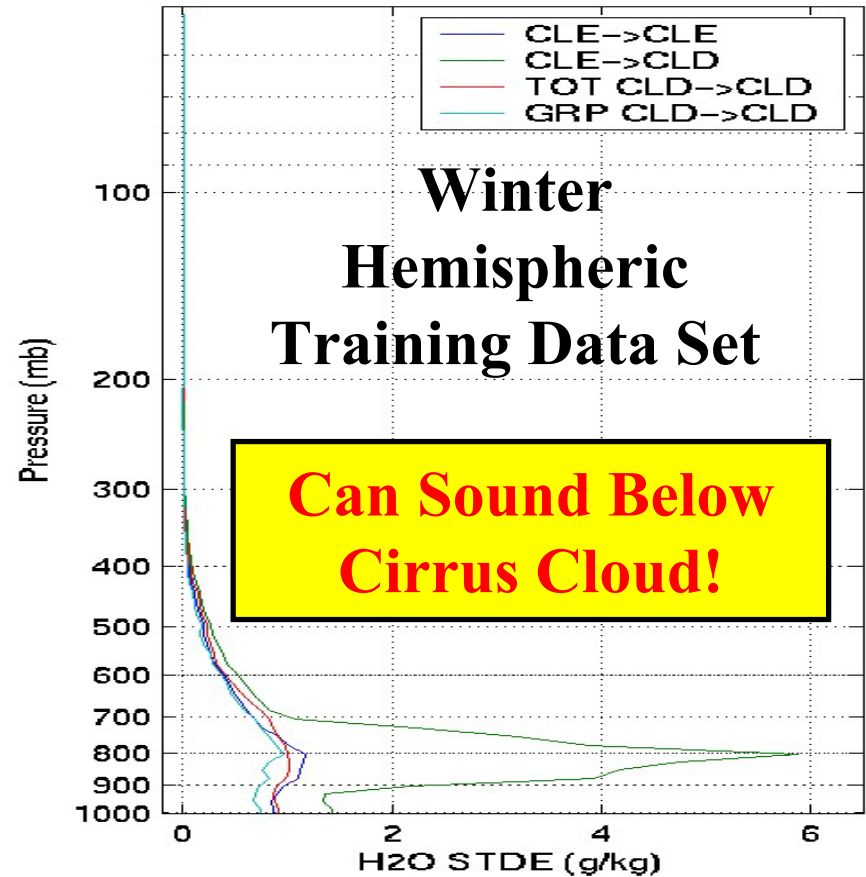
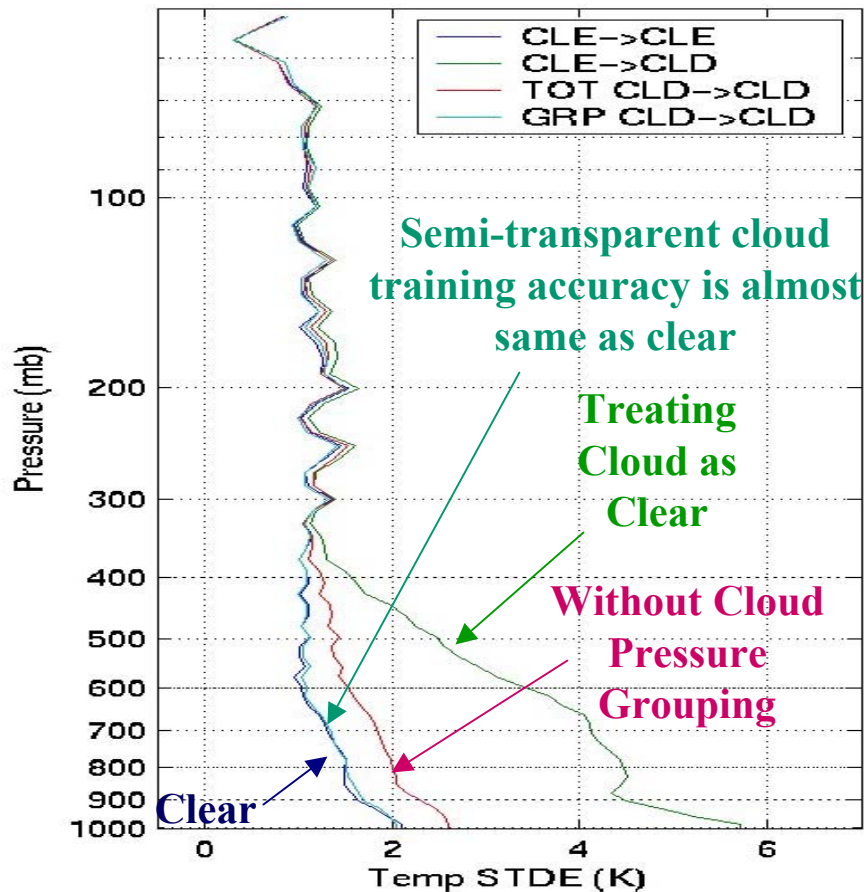
Wavnumber ( $\text{cm}^{-1}$ )

**Radiance spectral slope is sensitive to particle size**  
**Radiance magnitude is sensitive to optical depth**

# *Cloud Retrieval Training !*

- **Perform a realistic simulation of clouds for synthetic EOF radiance training**
- **Diagnose 0-2 cloud layers from radiosonde relative humidity profile**
  - A single cloud layer (either ice or liquid) is inserted into the input radiosonde profile.
  - Approximate lower level cloud using opaque cloud representation (i.e., isothermal/saturated)
- **Use parameterization of Heymsfeld's\* balloon and aircraft cloud microphysical data base (2003) to specify cloud effective particle radius,  $r_e$ , and cloud optical depth,  $\tau$ , (i.e.,  $r_e = a \tau^\alpha / [\tau - b\tau^\alpha]$ ) .**
  - Different habitats can be specified (Hexagonal columns assumed here)
  - Different clouds microphysical properties are simulated for same radiosonde using random number generator to specify visible cloud optical depth within a pre-specified range. 10 % random error added to parameterized effective radius to account for real data scatter.
- **Use LBLRTM/DISORT “lookup table” to specify cloud radiative properties**
  - Spectral transmittance and reflectance for ice and liquid clouds interpolated from multi-dimensional look-up table based on DISORT multiple scattering calculations for the (wavenumber range 500 – 2500  $\text{cm}^{-1}$ , zenith angle 0 – 80 deg.,  $\text{Deff}$  (Ice: 10 – 157  $\mu\text{m}$ , Liquid: 2 – 100  $\mu\text{m}$ ),  $\text{OD}(\text{vis})$  (Ice: 0.04 - 100, Liquid 0.06 – 150)
- **Compute EOFs and Regressions from cloudy radiance data base**
  - Regress cloud properties ( $p$ ,  $\tau$ ,  $r_e$ ) and surface and profile parameters against radiance EOFs
  - For small optical depth, output entire profile down to surface or lower opaque cloud level
  - For large upper level cloud optical depth, output profile above the upper cloud level

# Semi-transparent Cloud ( $\tau \leq 1$ ) Training Skill



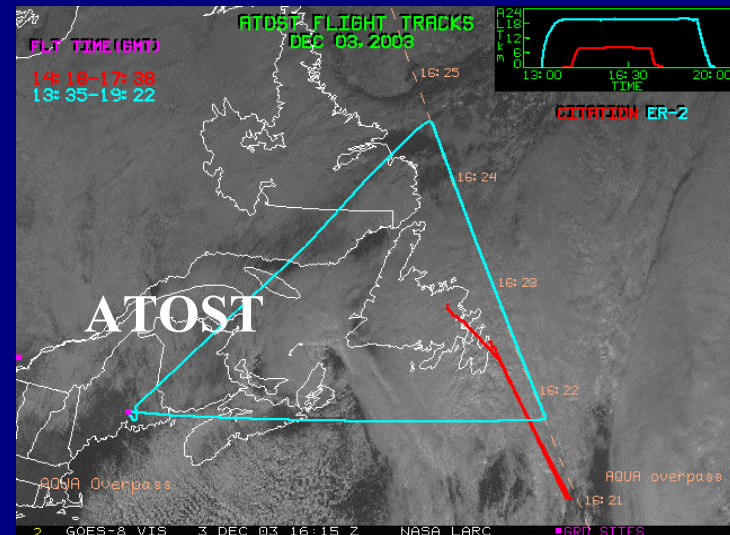
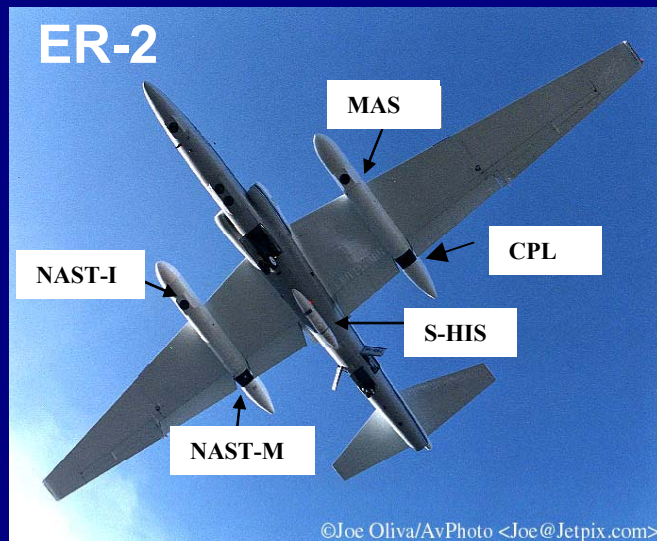
## Procedure for Finding Correct Upper Level Cloud Height:

- (1) Predict cloud pressure height using uncategorized statistics (i.e., without pressure grouping)
- (2) Predict cloud pressure height,  $p(n)$  using categorized statistics for  $p(n-1)$  cloud height obtained in (1)
- (3) Use statistics for cloud height  $p(n)$  to predict an  $n+1$  cloud height  $p(n+1)$
- (4) Compare new cloud height,  $p(n+1)$  with previously determined cloud height,  $p(n)$ :
  - (a) if  $p(n+1)=p(n)$ : obtain geophysical parameter retrievals using statistics for  $p(n+1)$
  - (b) if  $p(n+1) \neq p(n)$ : let  $p(n)=p(n+1)$  and predict a new  $p(n+1)$  using  $p(n)$  cloud statistics
- (5) Repeat step (4) until convergence in cloud height is obtained, and parameter retrievals, is obtained.

# ATReC ER-2 Deployment



- **ATReC (November 18 - December 15, 2003, Bangor, Maine).** The Atlantic-THORPEX Regional Campaign (ATReC) focused on reducing the number and size of significant weather forecast errors over Europe and the eastern USA by infusing extra remote sensing and in-situ observations over sensitive (i.e. oceanic) regions. ER-2 flights contributed to ATReC as focusing on satellite sensor validation underflights (TERRA, AQUA, & DMSP)
- NAST Research Objective: Profiling under complex cloud conditions

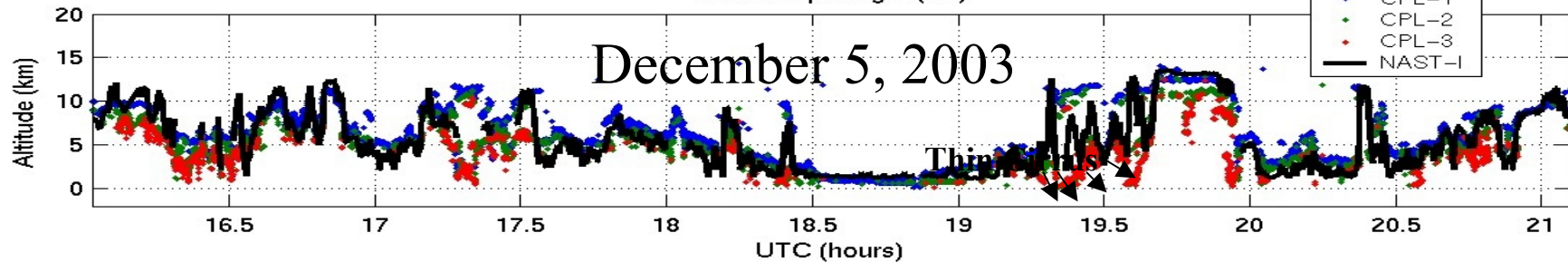


## Aircraft Payload Included:

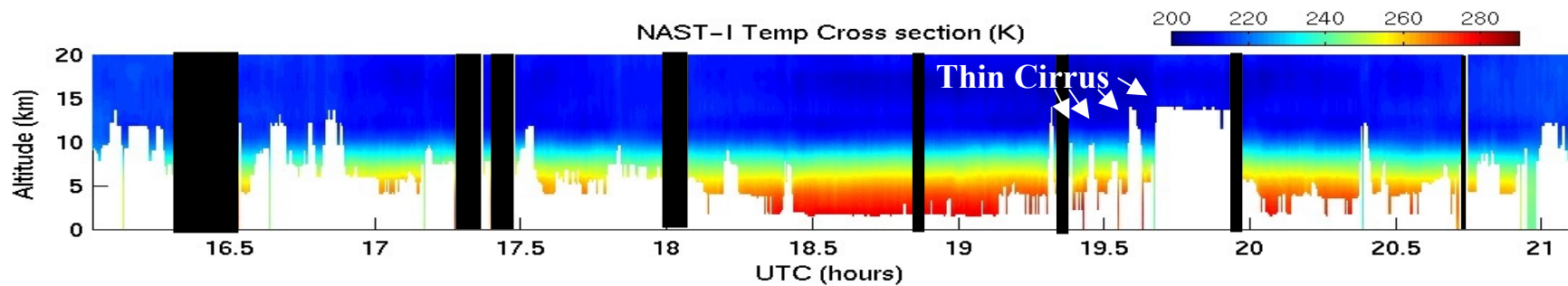
**NASA ER-2 (NAST-I, NAST-M, S-HIS, MAS, CPL, in-situ O3  
Drosondes (NOAA G-4 and Cessna Citation )**

**Satellite Platforms Included: Aqua, DMSP, Terra, and WindSat/Coriolis**

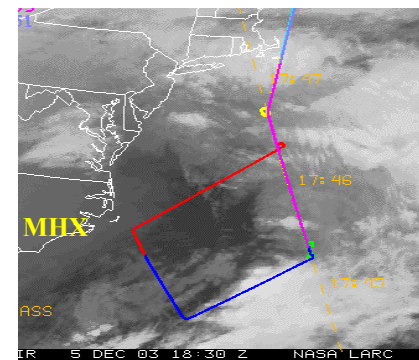
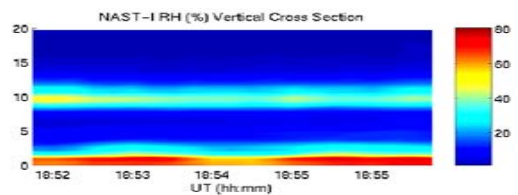
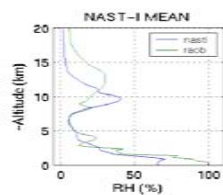
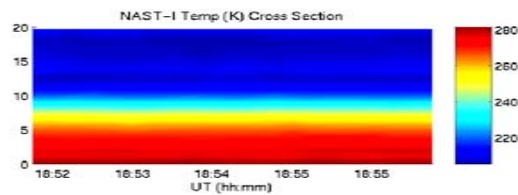
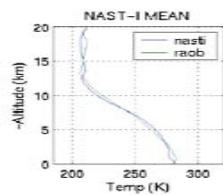
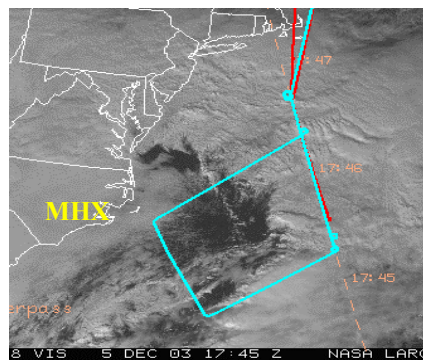
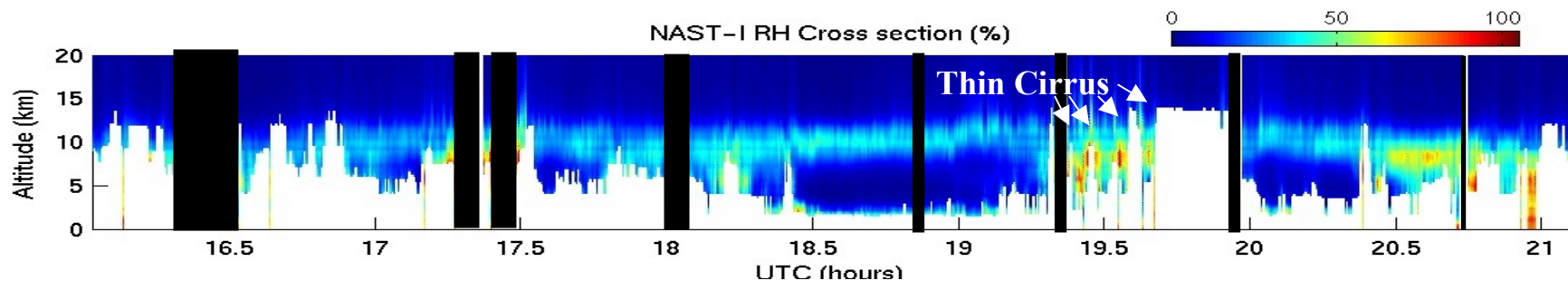
Cloud Top Height (km)



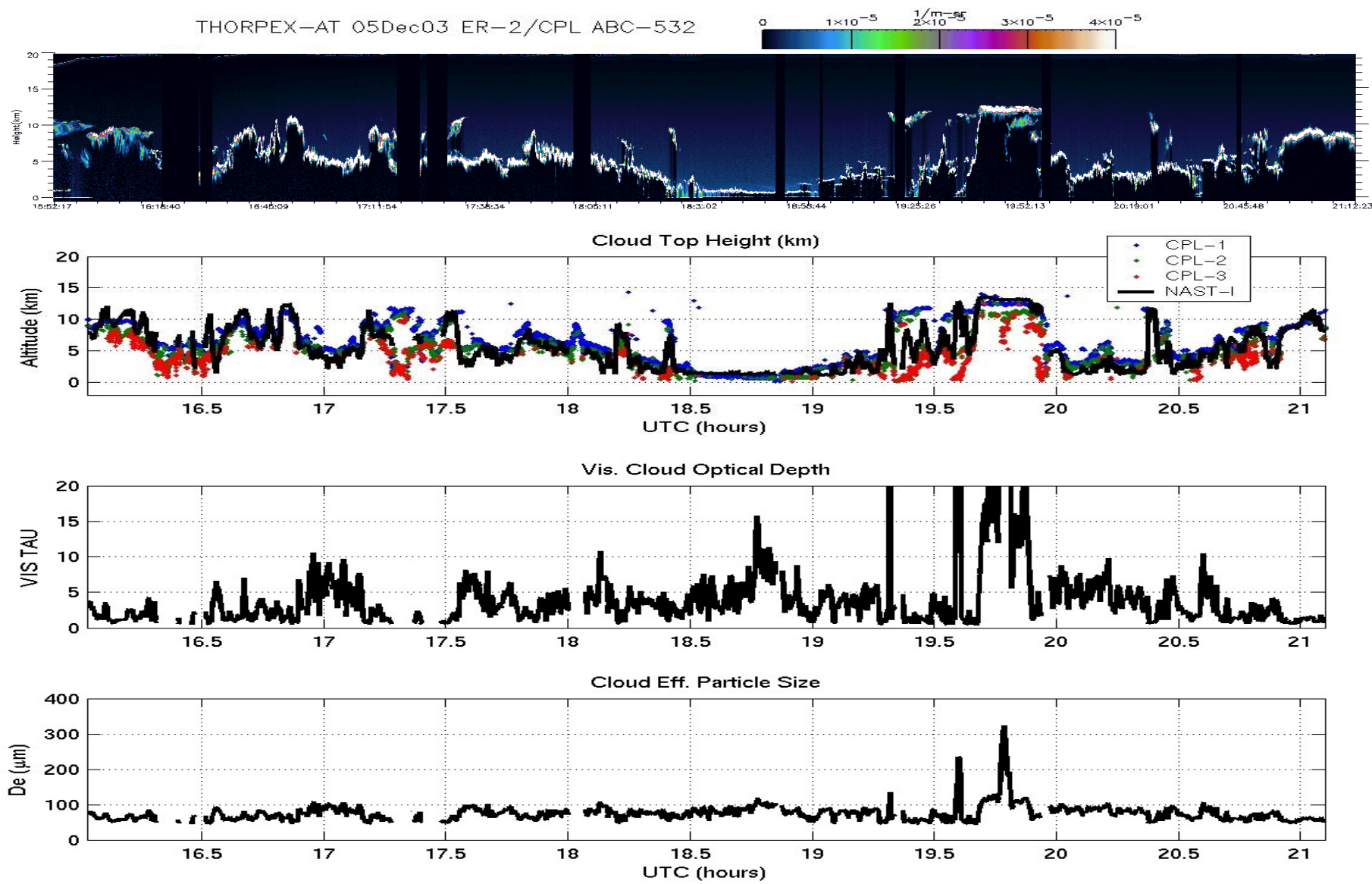
NAST-I Temp Cross section (K)



NAST-I RH Cross section (%)

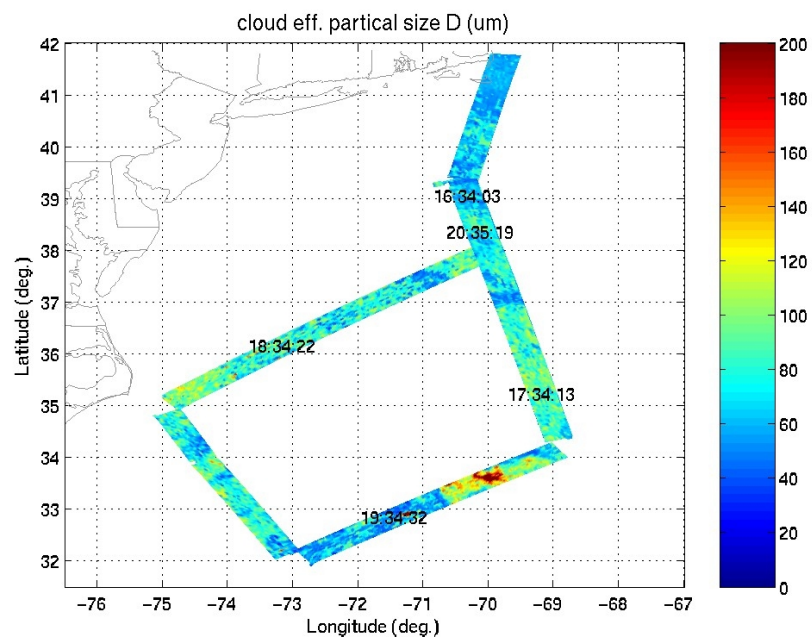
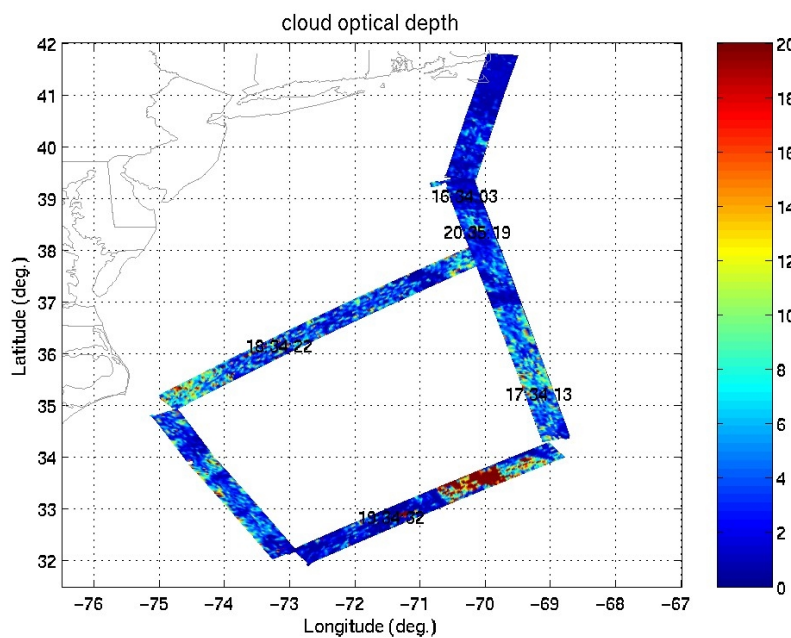
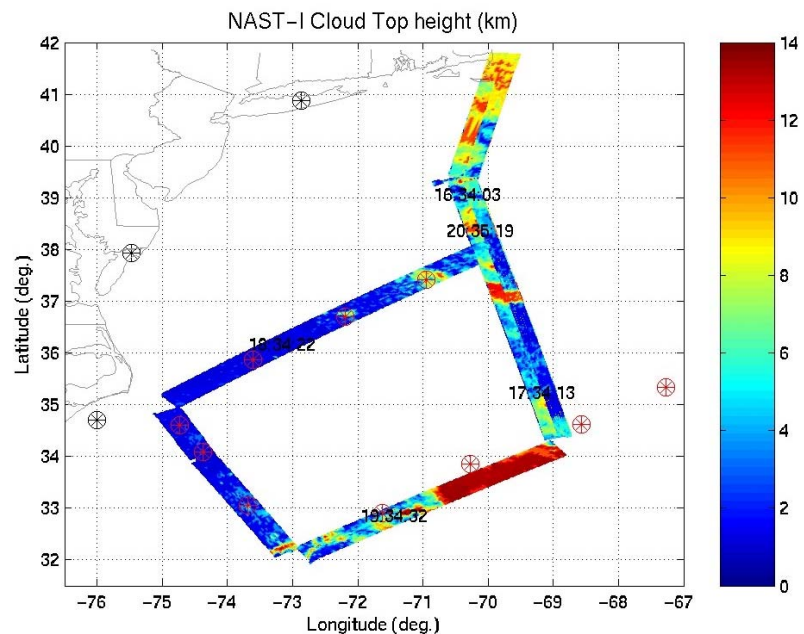
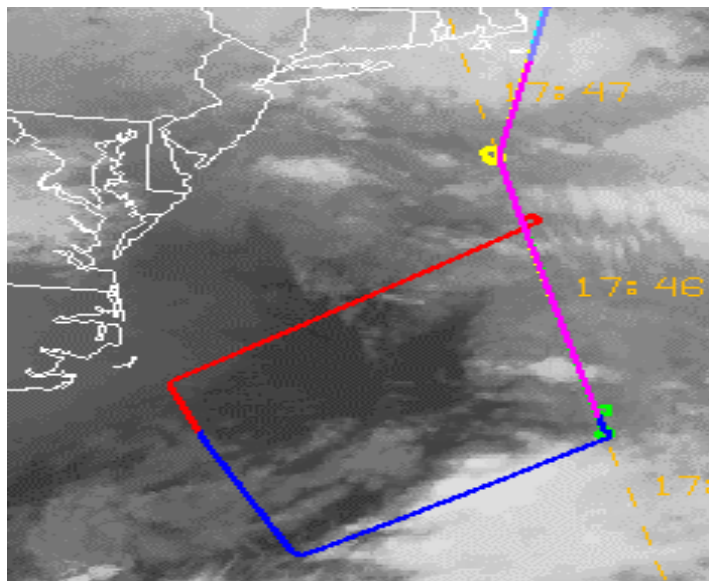


# December 5, ATReC Cloud Results

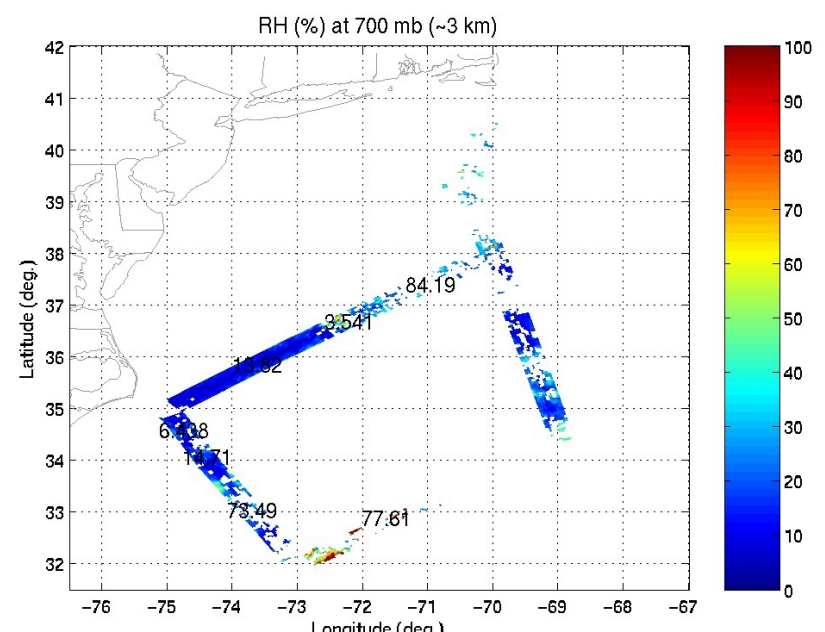
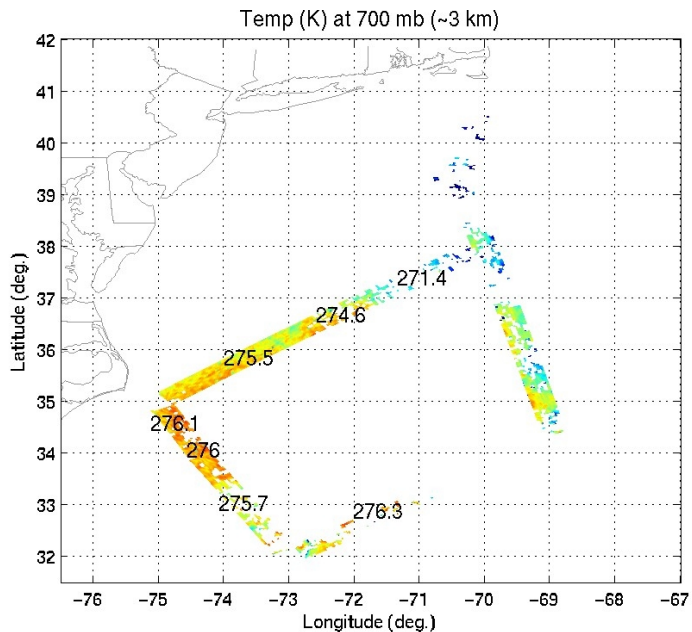
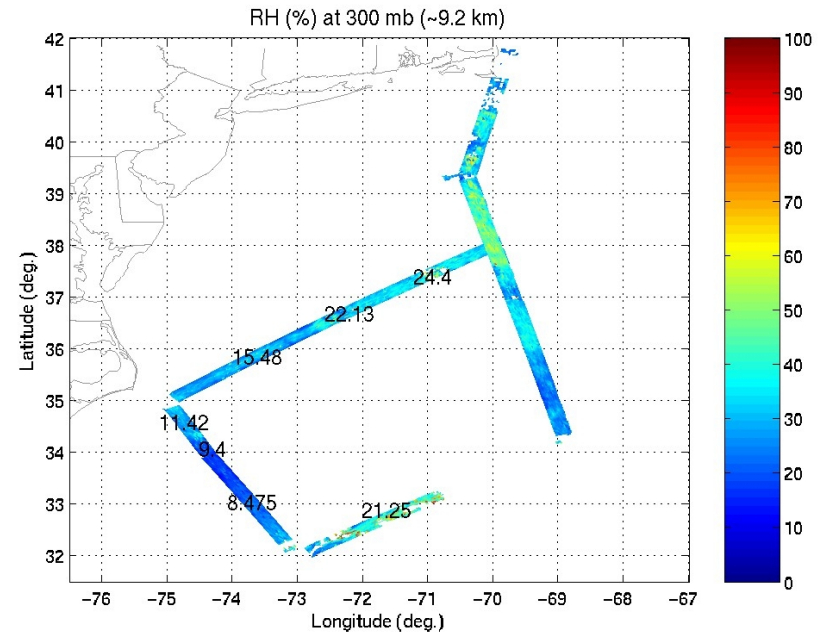
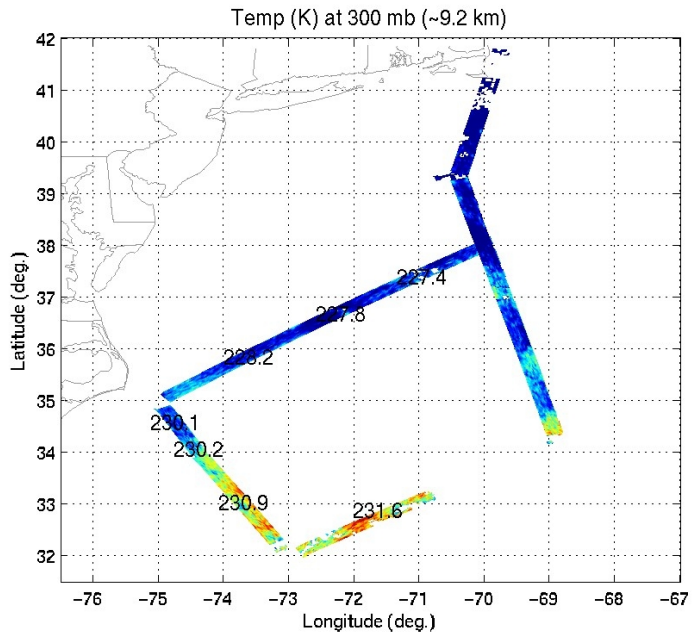




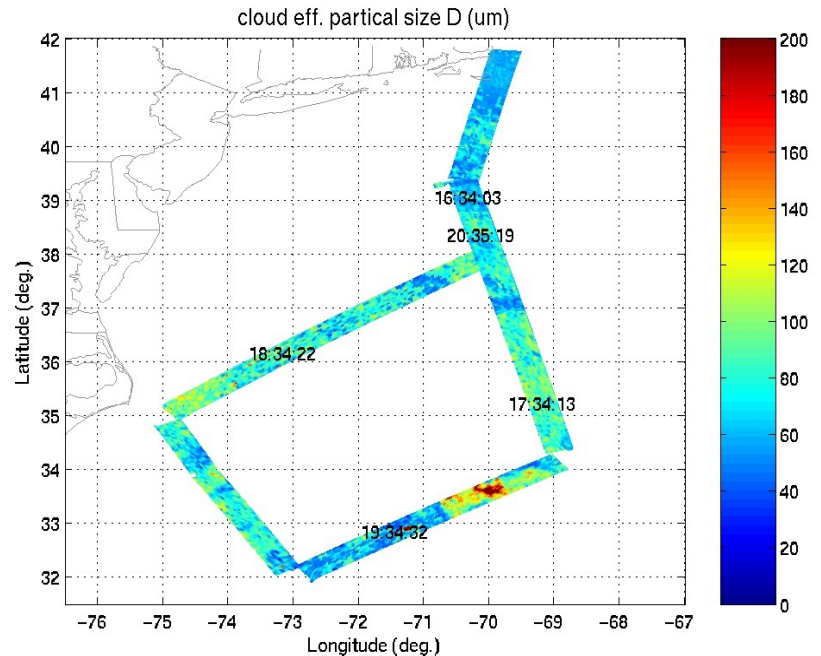
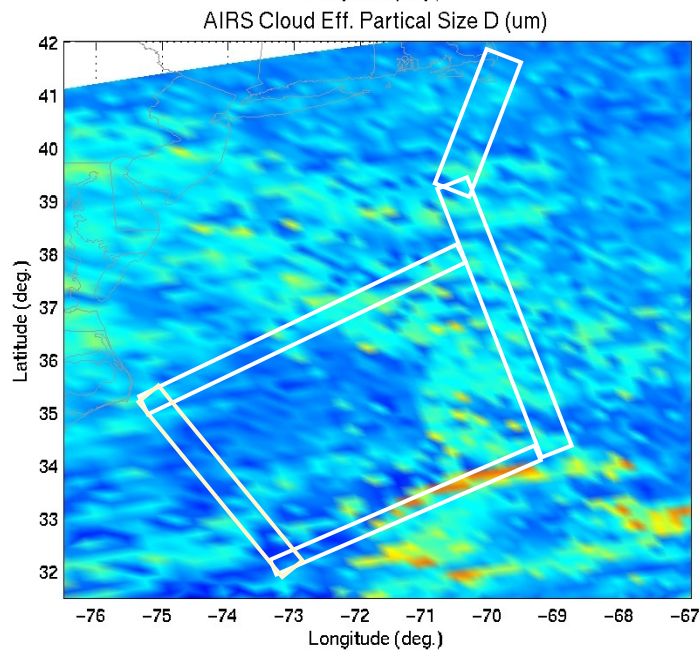
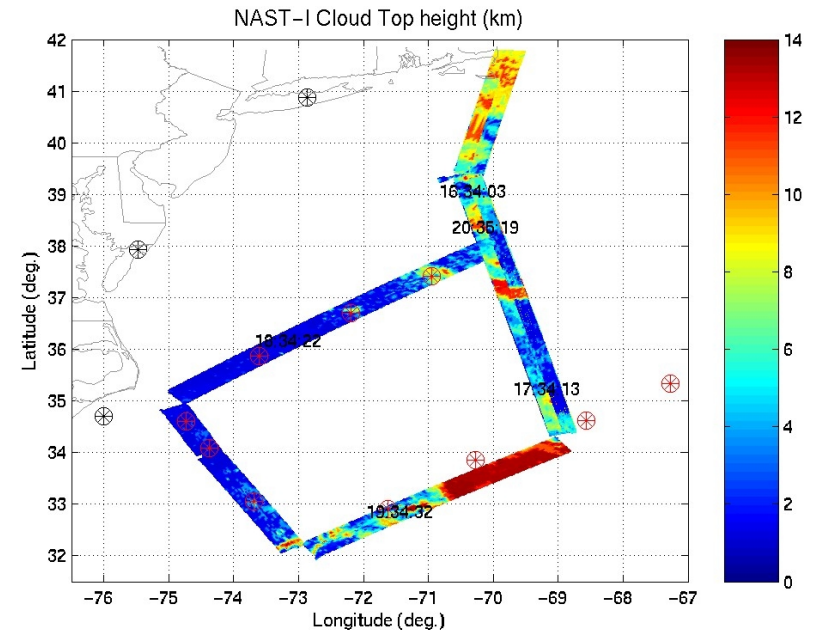
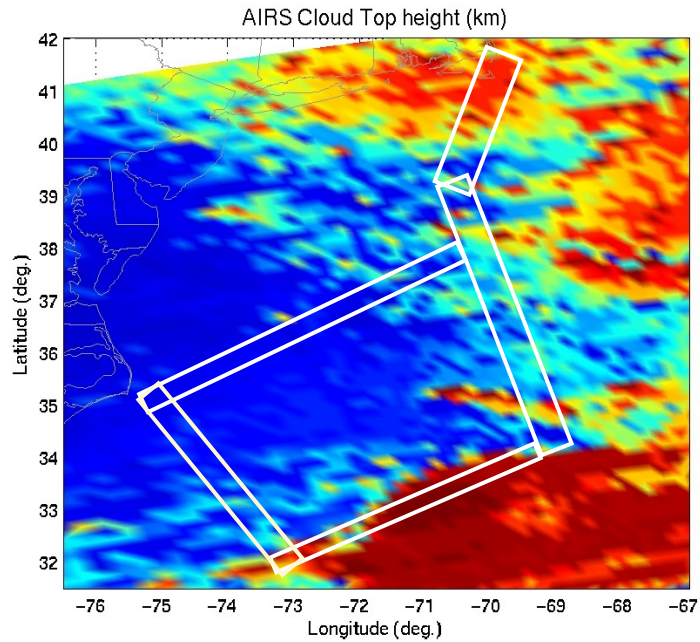
# December 5, ATReC Cloud Results



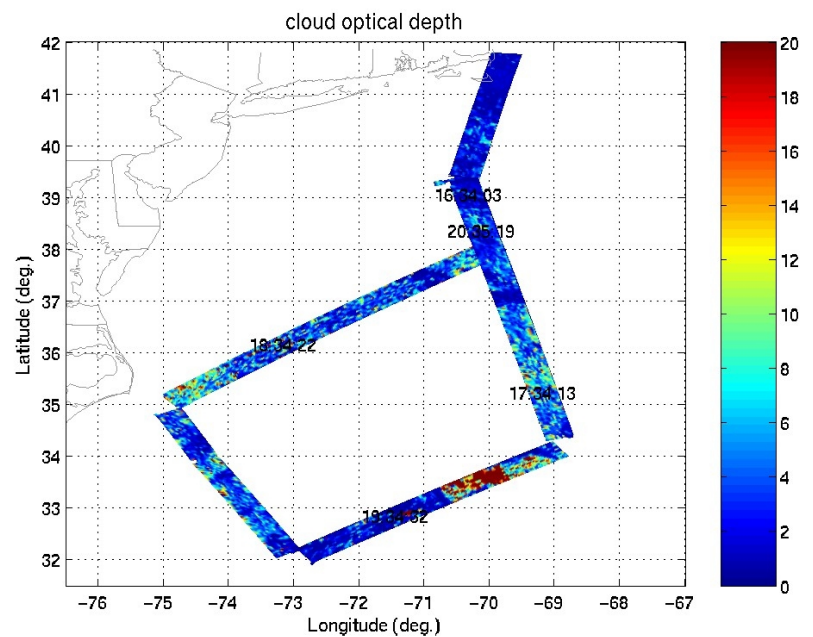
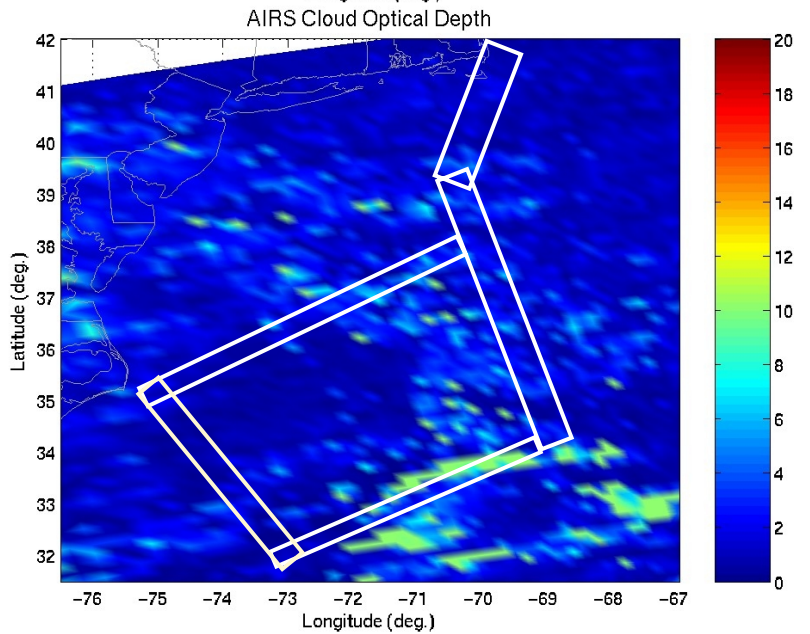
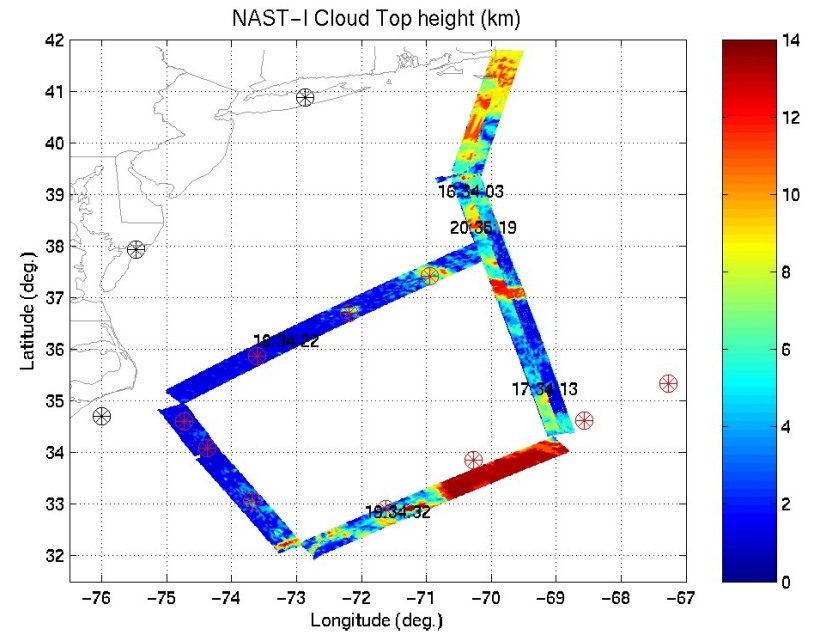
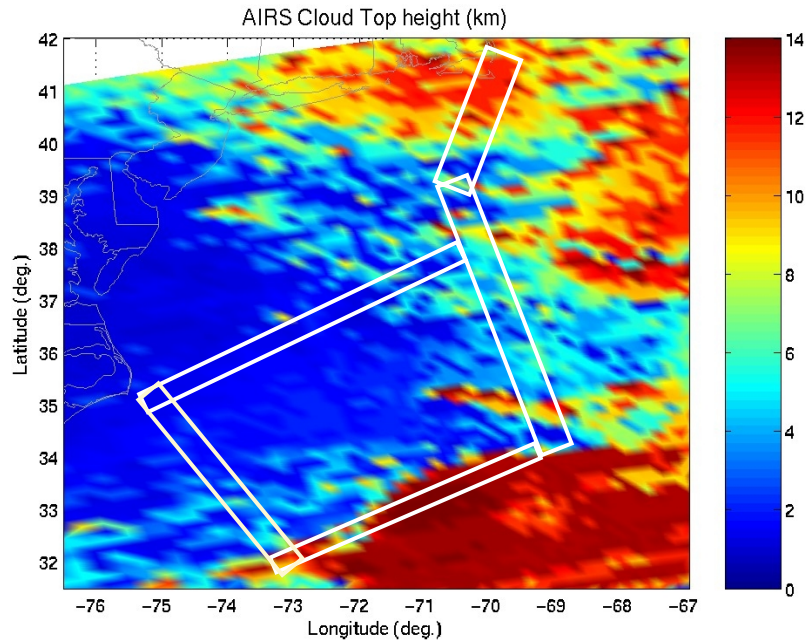
# December 5, ATReC Profile Results



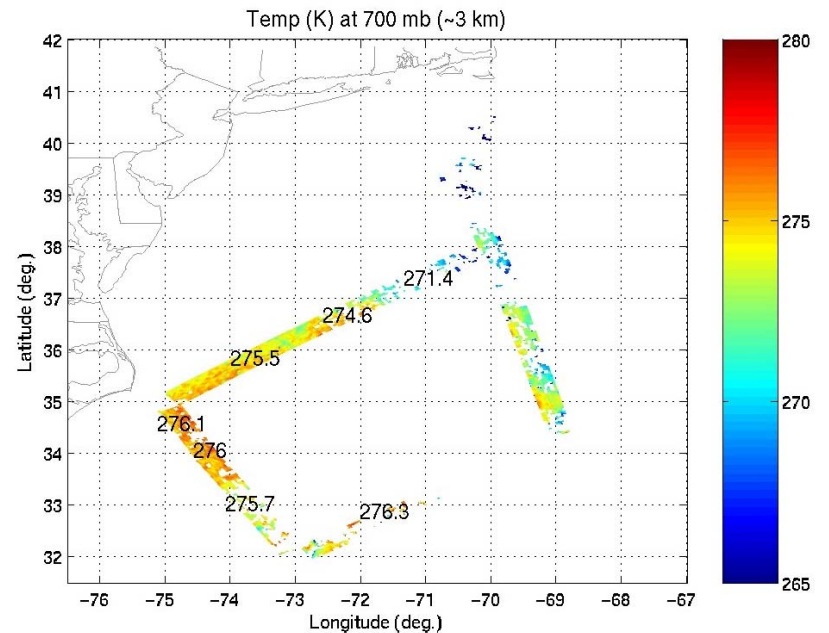
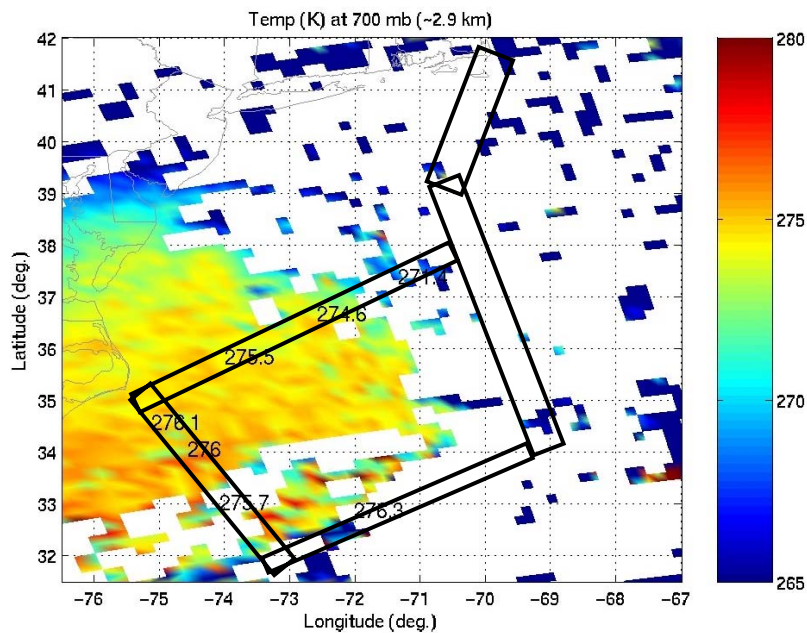
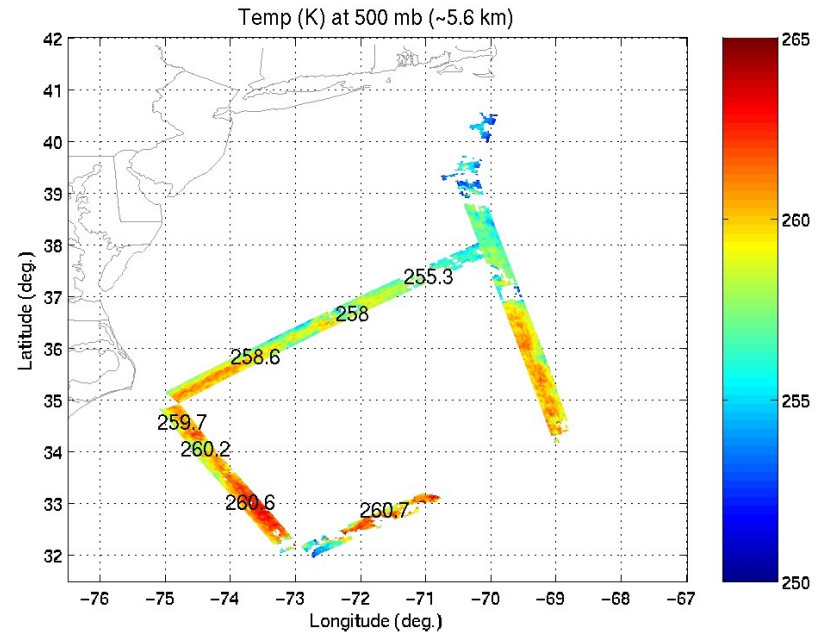
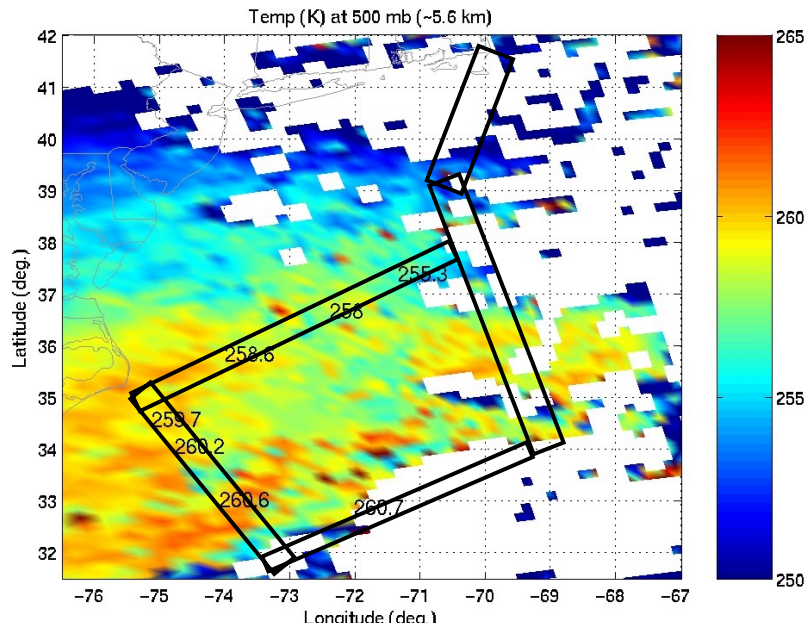
# AIRS Vs NAST-I Cloud Properties



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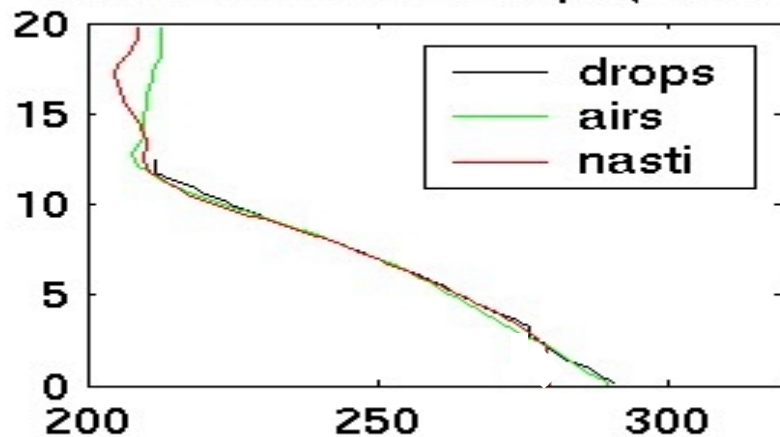


# AIRS Vs NAST-I Profile Properties

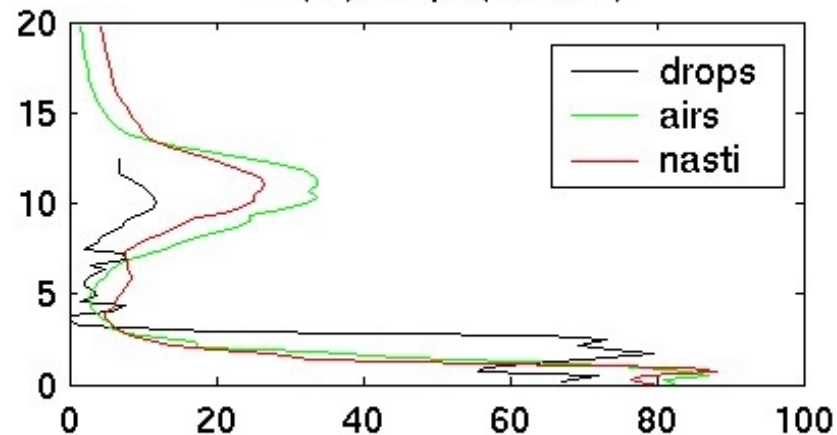


# Example Profile Comparisons

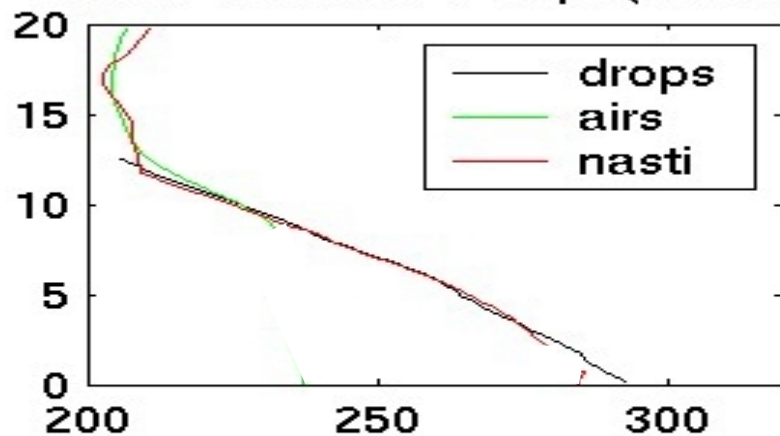
TEMPERATURE DropS(184814)



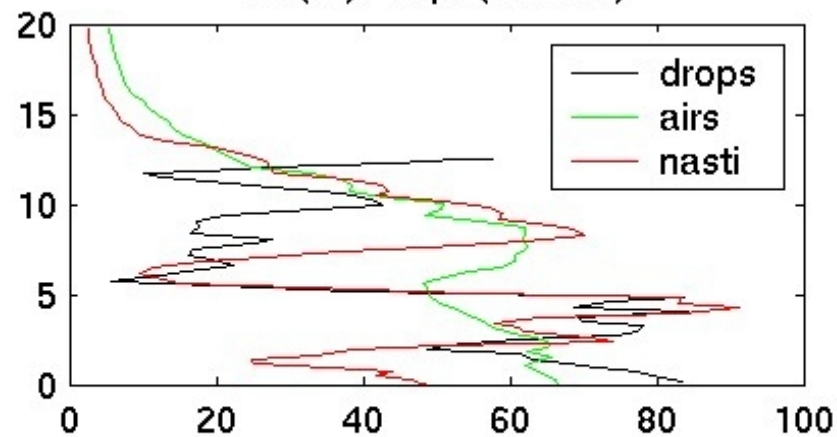
RH(%) DropS(184814)



TEMPERATURE DropS(191659)



RH(%) DropS(191659)



# Conclusions

- **High spatial resolution**
  - Sampling clear air
  - Optimizing cloudy sky retrievals
- **Cloud clearing**
  - Cloud clearing is useful for sounding under scattered clouds
  - AIRS can benefit from 1 km MODIS sounding channels
  - Cloud clearing causes loss of spatial resolution and clear air bias
- **Cloud training**
  - Permits sounding beneath semi-transparent cloud (i.e., thin cirrus)
  - Permits sounding to cloud level for opaque cloud conditions
  - Retrieved cloud properties can be used for 1-d Var Retrieval or for the direct assimilation of radiances into forecast model

**Ultimate approach for sounding retrieval or radiance assimilation with clouded hyperspectral radiances should employ a combination of cloud clearing and cloud training algorithms**