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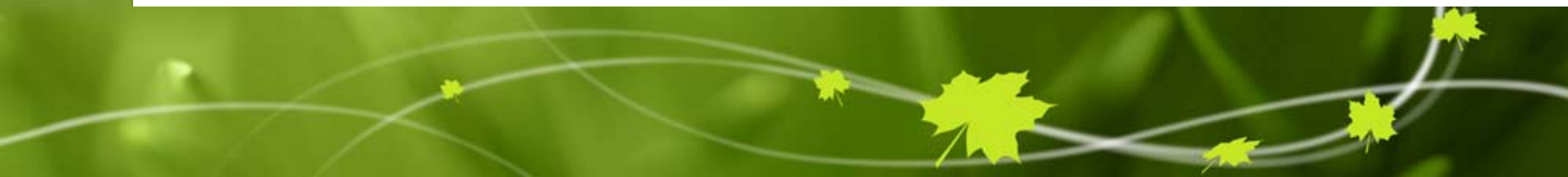
Assimilation of Cloud-Affected Infrared Radiances at Environment-Canada

**ECMWF-JCSDA Workshop on Assimilating
Satellite Observations of Clouds and Precipitation
into NWP models**

ECMWF, Reading (UK)

Sylvain Heilliette (Science and Technology Branch)

Tuesday, June 15th , 2010



Outline

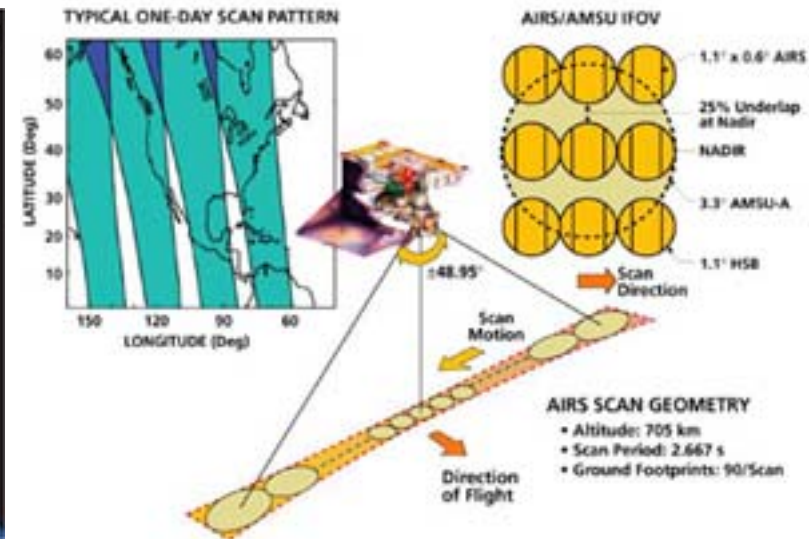
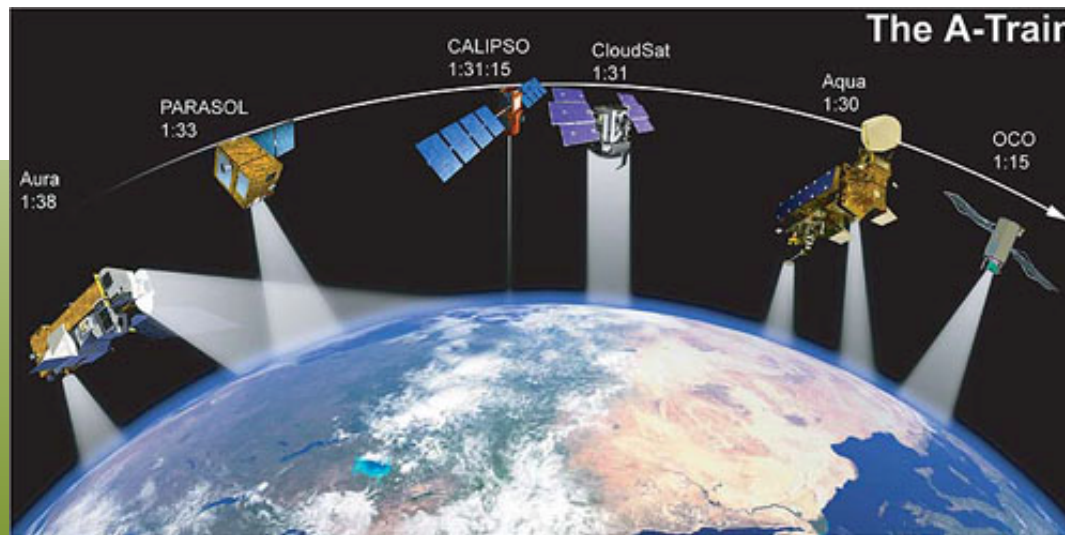
- Description of the AIRS and IASI instruments
- Assimilation of cloud unaffected IR radiances at EC
- Comparison of approaches using cloud effective parameters
- Assimilation of cloud affected IR radiances at EC
- A first 4D-Var assimilation cycle
- A second 4D-Var assimilation cycle
- Conclusions



Description of the AIRS and IASI Instruments:

AIRS Instrument Overview

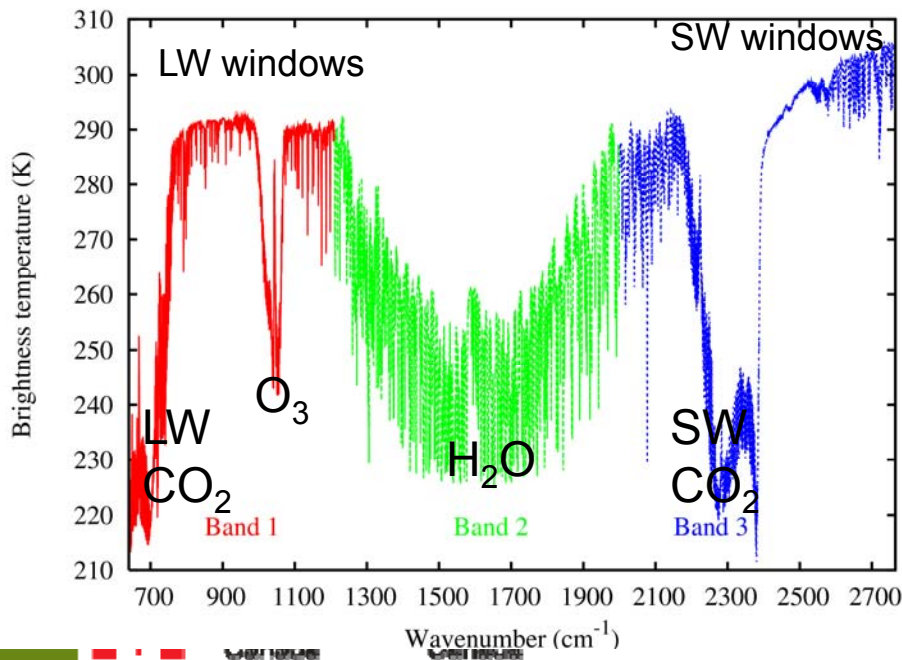
- High spectral resolution infrared vertical sounder (grating spectrometer with 2378 channels between $15.5\ \mu\text{m}$ and $3.6\ \mu\text{m}$) onboard AQUA : provides information on temperature, humidity, ozone, etc...)



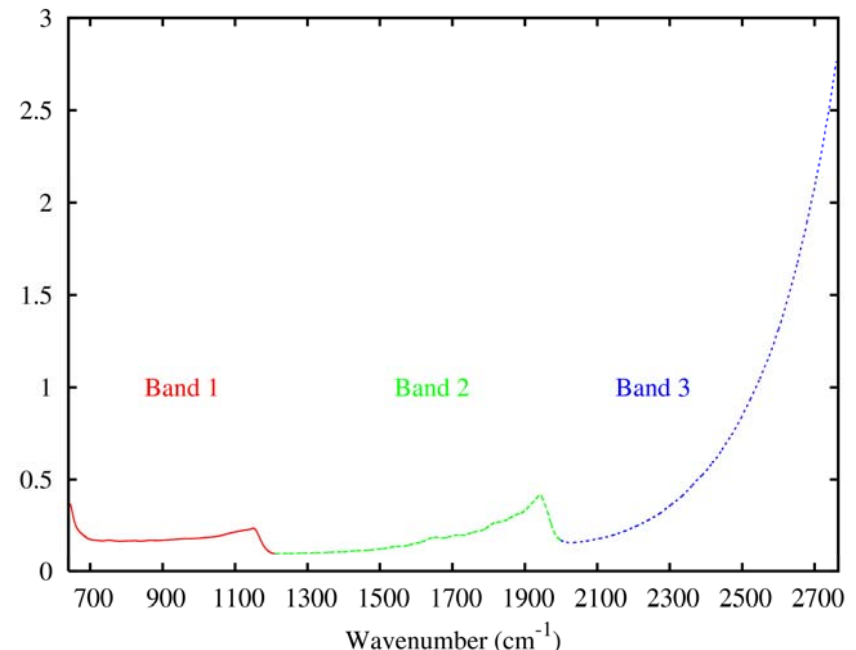
Description of the AIRS and IASI Instruments: IASI Instrument overview

- Infrared Atmospheric Sounding Interferometer
- Flying onboard the METOP-A European operational satellite (sun-synchronous polar orbit, mean equator crossing time 09.30, descending node)
- Provides high resolution spectra (apodised resolution of 0.5 cm^{-1}) of the infrared radiation emitted by earth/atmosphere between 645 cm^{-1} and 2760 cm^{-1} in 8461 channels

Typical full resolution spectrum



Radiometric noise characteristics



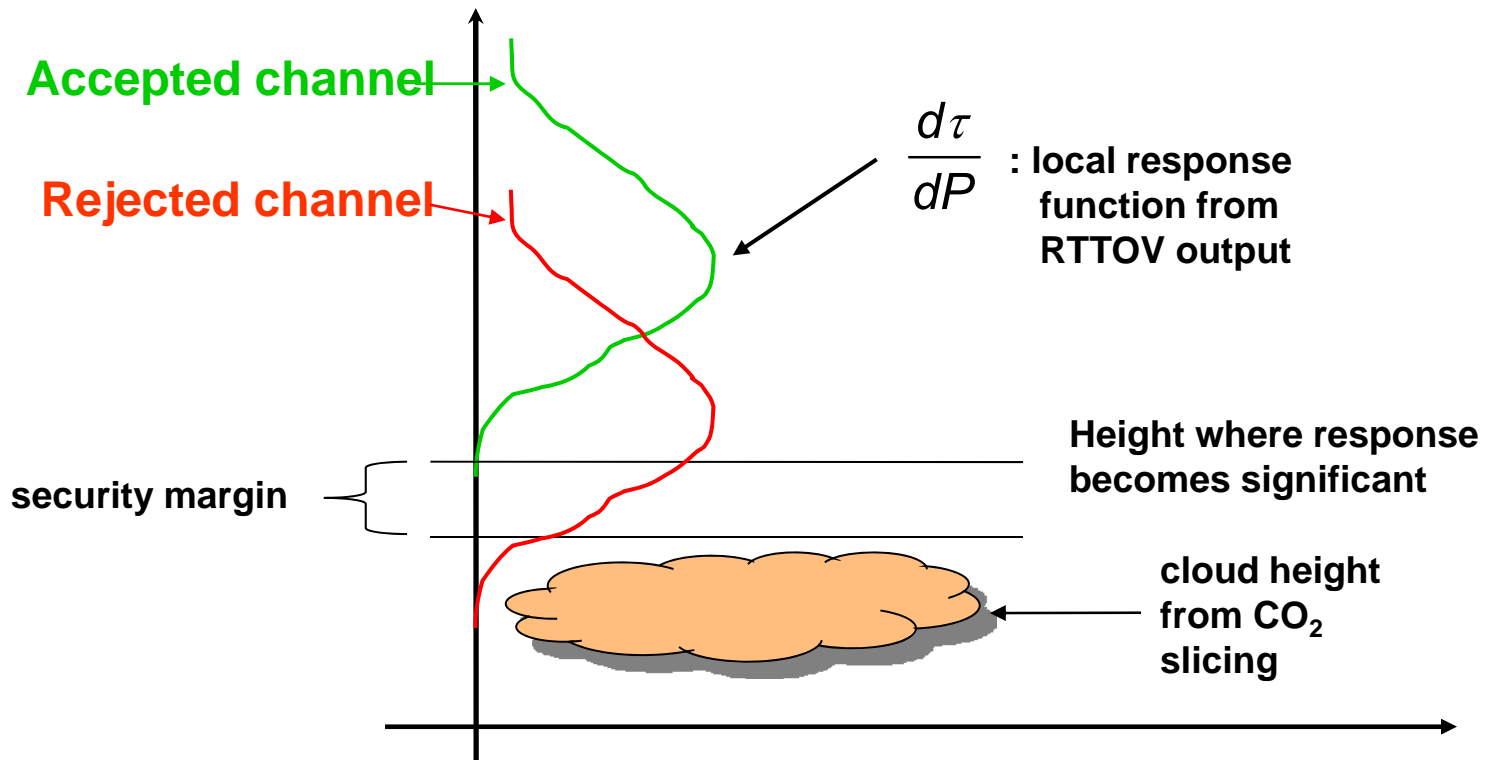
Description of the AIRS and IASI Instruments:

AIRS and IASI Channels Selected for Assimilation at EC

	LW T channels (15 μm)	Boundary layer channels (above sea only)	Ozone channels	H ₂ O channels (6.3 μm)	SW T channels	Total
Operational	20	10		33	24	87
Control 1	20/43	10/19		33/66	24	87/128
Exp1. when cloud- affected	20/43	10/19		33/66		53/128
Control 2	55/53	10/19		33/10	24	122/82
Exp2. when cloud- affected	55/53					55/53

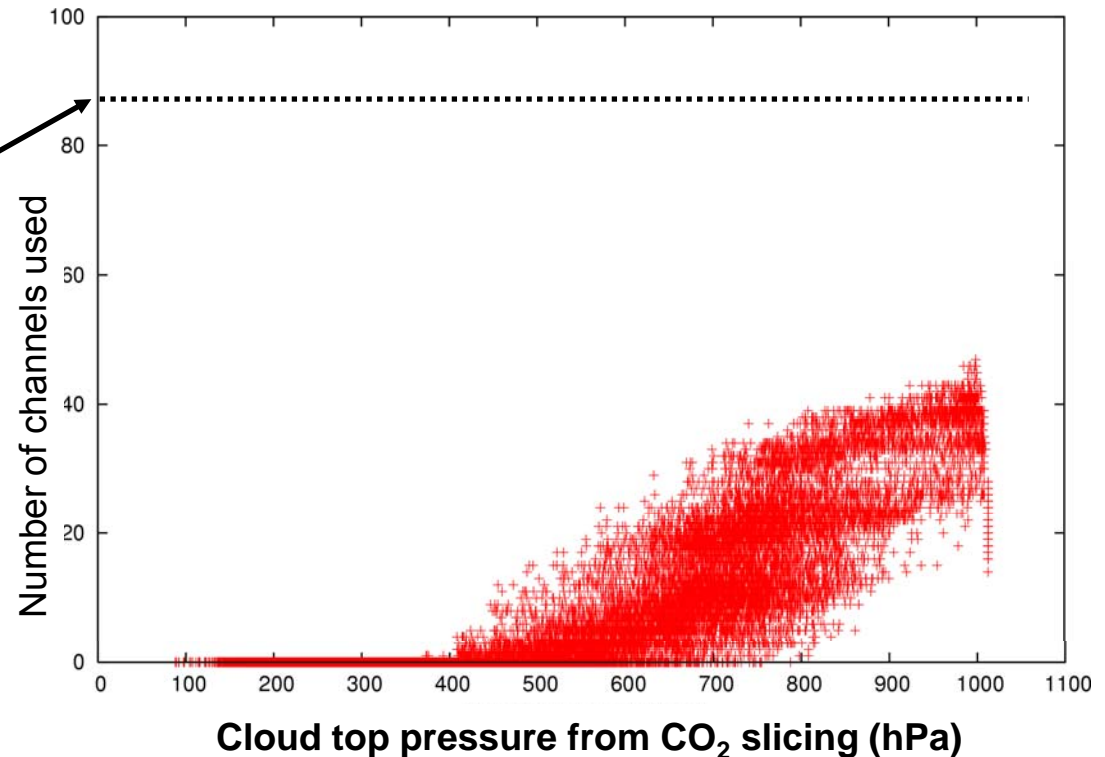


Assimilation of Cloud Unaffected IR Radiances at EC



Assimilation of Cloud Unaffected IR Radiances at EC : Severe Limitation in the Number of Assimilated Radiances

87 AIRS
channels
assimilated
in **clear sky**
case over
ocean



➔ No AIRS channel assimilated for $P_c < 400$ hPa

Comparison of Approaches Using Effective Parameters (1/2)

	UKMET	Meteo-France	ECMWF	CMC
Background value for cloud parameters	From <i>1Dvar</i> initialized by minimum residual (9 channels) method with big background errors	<i>CO₂ slicing</i> (124 pairs with the same reference channel at 979.13 cm ⁻¹)	<i>Minimum residuals</i> (using 2 or 3 channels)	<i>CO₂ slicing</i> (13 pairs of channels with different reference channels)
Variable cloud parameters in 4D-Var ?	no	no	yes	yes
Cloud parameters	$P_c, N\varepsilon$	$P_c, N\varepsilon$	$P_c, N\varepsilon$ (only P_c is variable)	P_c, δ, r_e, D_e (only the 2 first are variable)

Comparison of Approaches Using Effective Parameters (2/2)

	UKMET	Meteo-France	ECMWF	CMC
Conditions for cloudy assimilation	Above sea Radiances weakly affected by clouds	Above sea. $600 \text{ hPa} < P_c < 950 \text{ hPa}$ $N_\epsilon > 0.1$	Above sea $100 \text{ hPa} < P_c < 900 \text{ hPa}$ Overcast cloud	Above sea. $250 \text{ hPa} < P_c < P_s - 100 \text{ hPa}$ $N_\epsilon > 0.75$
Cloud ϵ modeling	no	no	no	yes
Obs. error for cloud params.	0	0	5 hPa for P_c 0 for N_ϵ	from CO_2 slicing estimates
Implemented operationally ?	yes	yes	yes	no
Assimilated channels	92 AIRS for 1D-Var pre-processing In 4D-Var ?	54 in the CO_2 15 μm band (AIRS)	Same as cloud unaffected cases except for SW channels	15 μm CO_2 only

Assimilation of Cloud Affected IR Radiances at EC: Simplified Cloudy Radiance Modeling With Effective Cloud Parameters (1/2)

- Simplified description of the cloud radiative effect for a cloud located at P_c with cloud emissivity spectrum $N\varepsilon(\nu)$:

$$I_{cld}(\nu) = N\varepsilon(\nu)I_{ovc}(\nu, P_c) + (1 - N\varepsilon(\nu))I_{clr}(\nu)$$

$I_{cld}(\nu)$: Cloudy radiance

$N\varepsilon(\nu)$: Cloud effective emissivity

$I_{ovc}(\nu, P_c)$: Cloudy overcast radiance

$I_{clr}(\nu)$: Clear radiance

Assimilation of Cloud Affected IR Radiances at EC: Simplified Cloudy Radiance Modeling With Effective Cloud Parameters (2/2)

- Cloud emissivity model:

$$N\varepsilon(\nu) = 1 - \exp\left[-k_{cld}(\nu, r_e, D_e)\delta\right]$$

r_e : effective radius for liquid phase (set to 12 μm)

D_e : effective diameter for ice phase (set to 55 μm)

δ : effective cloud water path

- Up to date optical properties of liquid and solid (ice) water are used
- Scattering is accounted for approximately
- ***It is implicitly assumed that the cloud covers the whole field of view***
- First guess and background values determined from CO₂ slicing for δ (via retrieved $N\varepsilon$) and P_c

Assimilation of Cloud Affected IR Radiances at EC : Proposed 3D/4D-Var Assimilation

- Addition to the state vector \mathbf{x} of a *local* estimate of the 4 cloud parameters at each AIRS observation location

$$\mathbf{x} \rightarrow \tilde{\mathbf{x}} = (\mathbf{x}, \mathbf{z}) \quad \text{State augmentation}$$

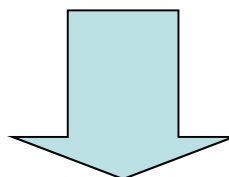
\mathbf{x} : model fields

\mathbf{z} : vector of local effective parameters :

$$\text{Dim}(\mathbf{x}) \sim 10^6 - 10^7$$

$$\text{Dim}(\mathbf{z}) = 4N_{\text{obs}} \sim 10^4$$

$$\mathbf{z} = (\underbrace{P_{c1}, \delta_1, r_{e1}, D_{e1}}_{\text{obs. 1}}, \dots, \underbrace{P_{ci}, \delta_i, r_{ei}, D_{ei}}_{\text{obs. i}}, \dots, \underbrace{P_{cn}, \delta_n, r_{en}, D_{en}}_{\text{obs. n}})$$



$$J_c(\tilde{\mathbf{x}}) = \left\{ \underbrace{(\mathbf{x} - \mathbf{x}_b)^t \mathbf{B}^{-1} (\mathbf{x} - \mathbf{x}_b)}_{\text{Background term}} + \underbrace{(\mathbf{z} - \mathbf{z}_b)^t \mathbf{C}^{-1} (\mathbf{z} - \mathbf{z}_b)}_{\text{Cloudy background term}} + \underbrace{(\mathbf{H}_c(\tilde{\mathbf{x}}) - \mathbf{y})^t \mathbf{O}^{-1} (\mathbf{H}_c(\tilde{\mathbf{x}}) - \mathbf{y})}_{\text{Observation term with cloud}} \right\}$$

\mathbf{z}_b : cloud background state from CO₂ slicing and climatology

\mathbf{H}_c cloudy observation operator combining **RTTOV 8.7** and the cloud emissivity model

Assimilation of Cloud Affected IR Radiances at EC : Preconditioning of 4D-Var Assimilation

- Minimization of the cost function more difficult in 4D-Var mode than it was in 3D-Var mode
- Need for a preconditioning with the diagonal of the hessian Matrix for cloud parameters

$$\mathbf{z} \longrightarrow \mathbf{Z} = \mathbf{C}(\mathbf{z} - \mathbf{z}_b)$$

Where \mathbf{z} is a cloud parameter

with
$$\mathbf{C} = \sqrt{\frac{1}{\sigma_c^2} + \sum_{\text{channels } i} \left(\frac{1}{\sigma_{oi}} \frac{\partial H_i}{\partial \mathbf{z}} \right)^2}$$
 Instead of
$$\mathbf{C} = \frac{1}{\sigma_c}$$

σ_c represents the error associated with the cloud parameter \mathbf{z}

σ_{oi} represents the observation error of channel i

H is the radiative transfer operator

A First 4D-Var Assimilation Cycle : Description of the 4D-Var Experiments

- Background error for cloud parameters :

$$\sigma_{bP_c} = \frac{2.0}{\left(\frac{\partial BT_{window}}{\partial P_c} \right)}$$

$$\sigma_{b\delta} = \frac{2.0}{\left(\frac{\partial BT_{window}}{\partial \delta} \right)}$$

Description of the model

- GEM global model
- 800x600 grid
- 80 vertical hybrid levels with a top at 0.1 hPa

A First 4D-Var Assimilation Cycle: Quality Control Criteria for Cloud-affected Radiances Experiment 1

- Assimilation of cloudy radiances above sea only
- No assimilation of AIRS shortwave channels
- **250 hPa < P_c < P_s-100 hPa**
- **Restriction to near overcast situations (N_ε>0.9)**
- Exclusion of situations with temperature inversion leading to an ambiguous solution for the CO₂ slicing algorithm
- Restriction to situation where the solution of the CO₂ slicing is well defined (σ_{P_c}<50 hPa, σ_{N_ε}<0.1)
- To limit the impact of uncertainty on cloud phase:

$$\left| \left(\varepsilon_{ice} - \varepsilon_{liquid} \right) \frac{\partial T_B}{\partial \varepsilon} \frac{1}{\sigma_{obs}} \right| \leq \frac{1}{4}$$

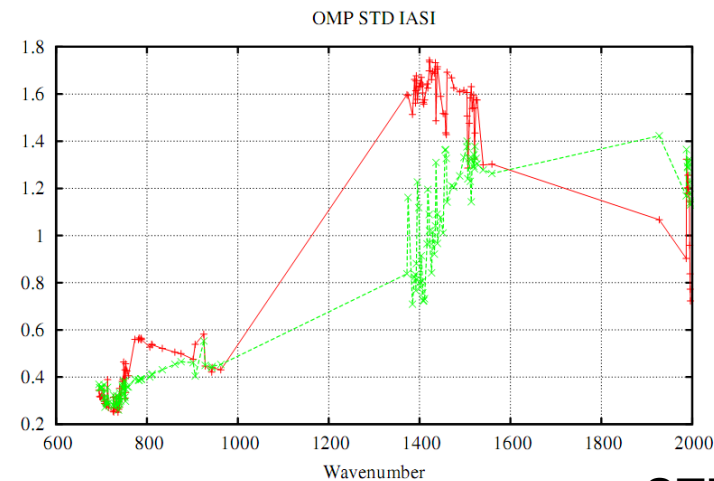
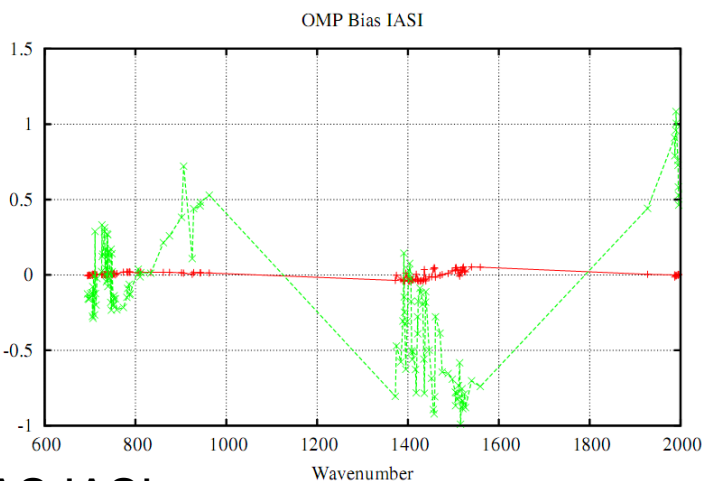
A First 4D-Var Assimilation Cycle : Description of the 4d-var Experiment 1

From 12/15/2008 to 01/08/2009 (25 days).

- **Control 1 experiment:**
 - Conventional data (radiosondes, etc...).
 - Quikscat winds.
 - AMSU-A and AMSU-B microwave radiances.
 - SSM-I and SSM-I-S microwave radiances.
 - **GEORAD radiances.**
 - AIRS infrared radiances (87 channels).
 - **IASI infrared radiances (128 channels).**
 - GPS radio-occultation (refractivity profiles).
 - **Humidity from planes.**
- **Cloudy 1 test experiment:** same as above + AIRS and IASI in cloudy mode with bias correction represented by a constant (instead of $A*BT+B$ in the control run).

A First 4D-Var Assimilation Cycle : IASI Obs-first Guess Statistics 6h Period

	CONTROL1	CLOUDY1	INCREASE
AIRS	2997 FOVS 66189 rad.	3185 FOVS 71939 rad.	+6% FOVS +8% RAD.
IASI	3958 FOVS 155696 rad.	4258 FOVS 183042 rad.	+7% FOVS +17% RAD.



BIAS IASI

OMP clear —+— OMP cloudy - - - x - - -

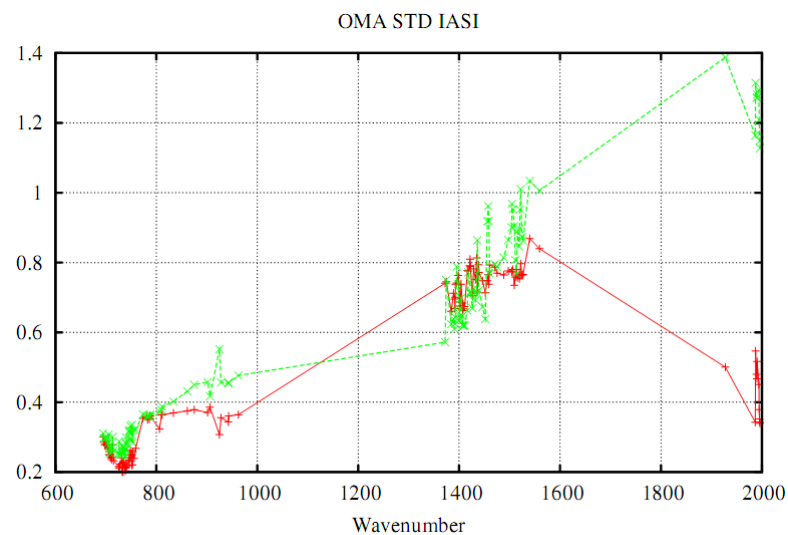
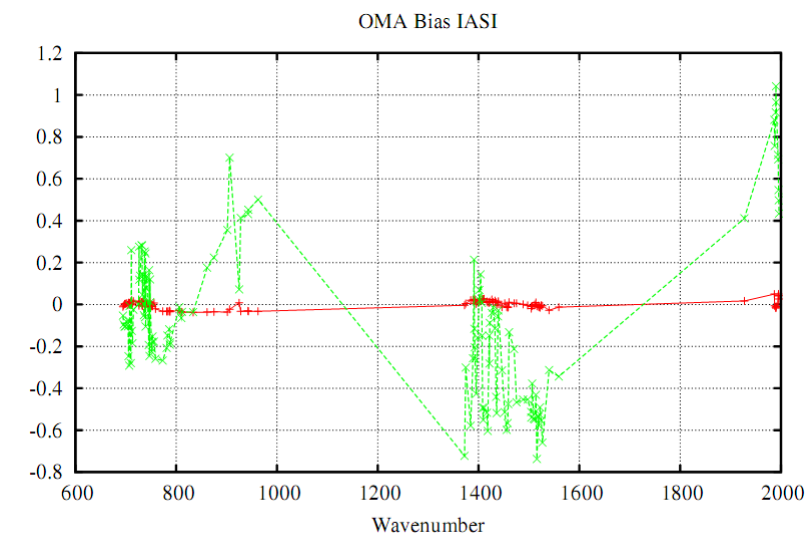
STD IASI

OMP clear —+— OMP cloudy - - - x - - -

- Residual bias for cloudy radiances not negligible
- Cloudy standard deviation lower for water vapor sensitive channels
- Very similar standard deviation for temperature channels



A First 4D-Var Assimilation Cycle: IASI Obs-analysis Statistics 6h Period



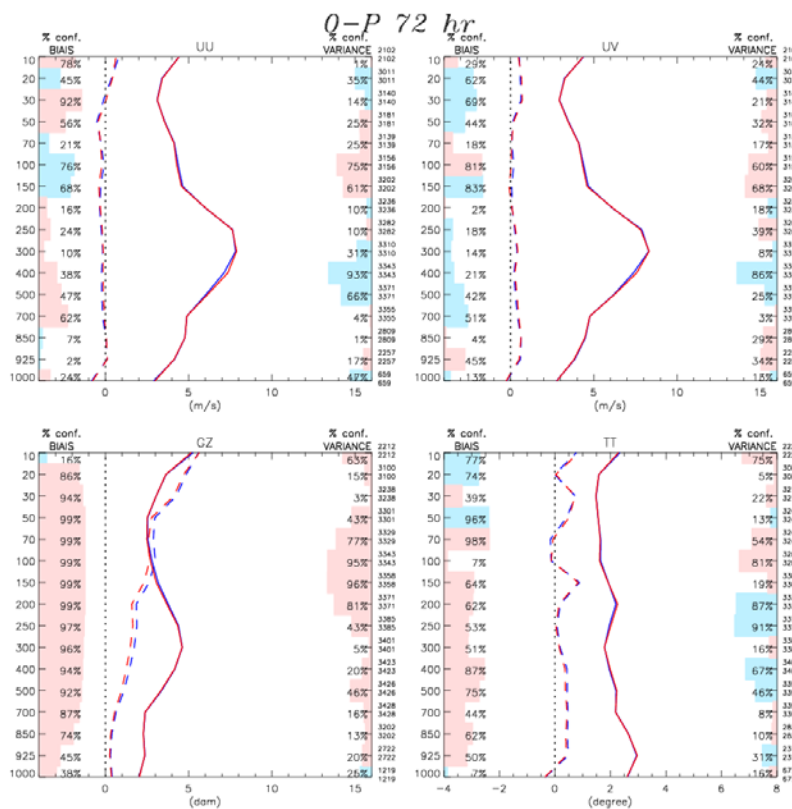
BIAS IASI OMA clear —+— OMA cloudy - - - x - - -

OMA clear —+— OMA cloudy - - - x - - - STD IASI

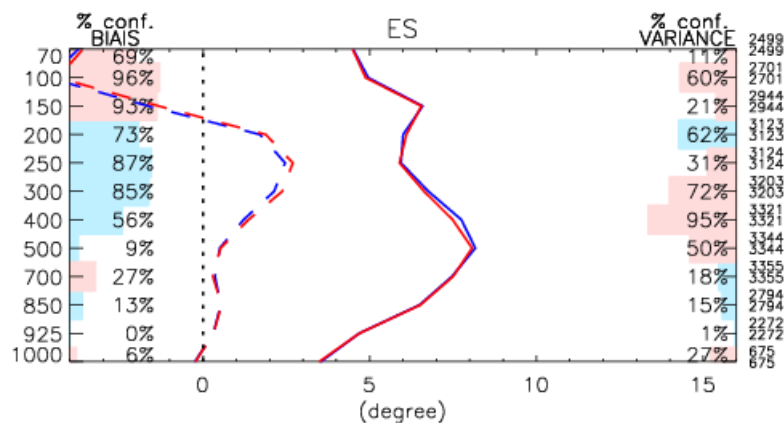
- Persistent residual bias for cloudy radiances
- Similar standard deviation after assimilation except for channels close to 2000 cm^{-1}

A First 4D-Var Assimilation Cycle : Validation of Forecasts Against Radiosondes: North America 72 H

Wind



Dew point depression



38 cases

Legend:

- Control is better
- Test is better

Geopotential height

Temperature



A First 4D-Var Assimilation Cycle : Validation Against Analyses North America Temperature Anomaly Correlation

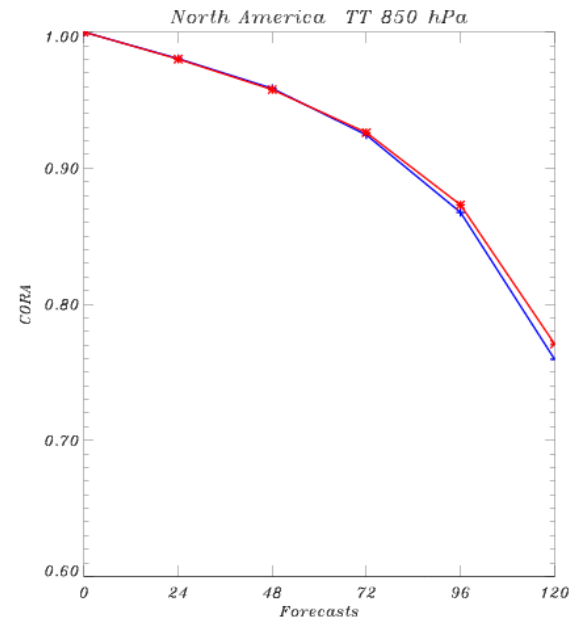
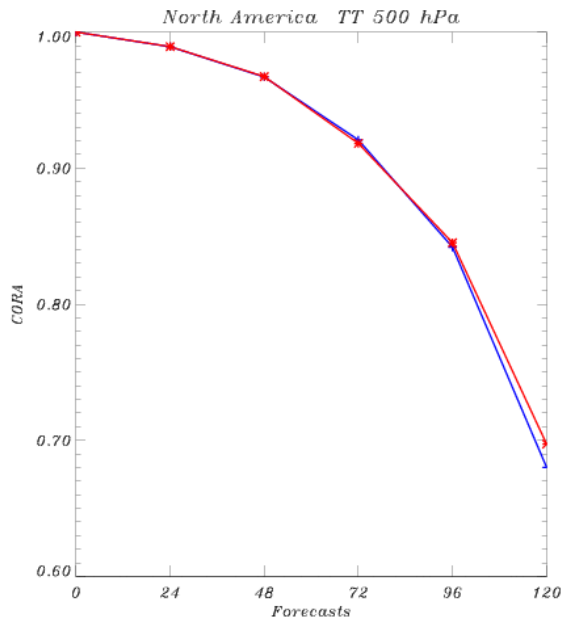
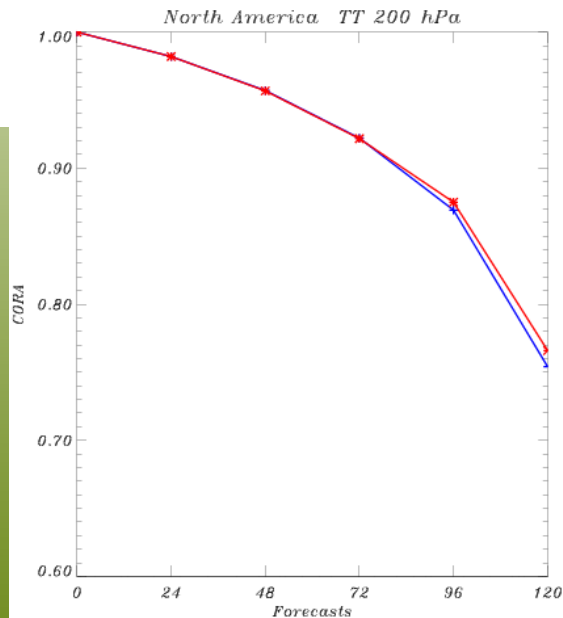
Control

Experiment

200 hPa

500 hPa

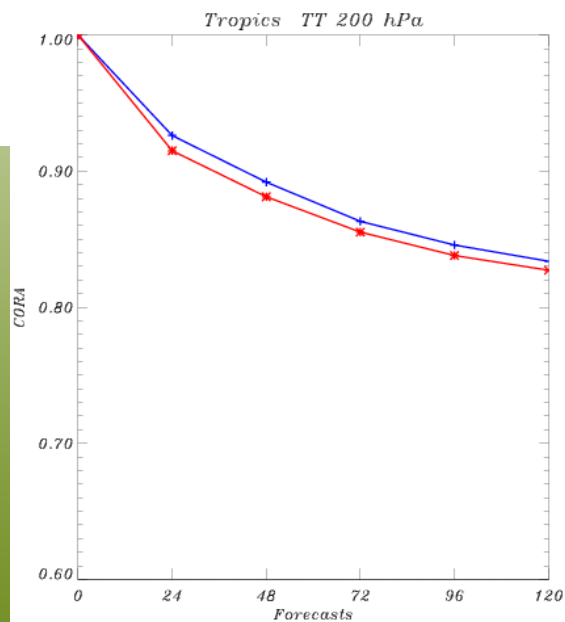
850 hPa



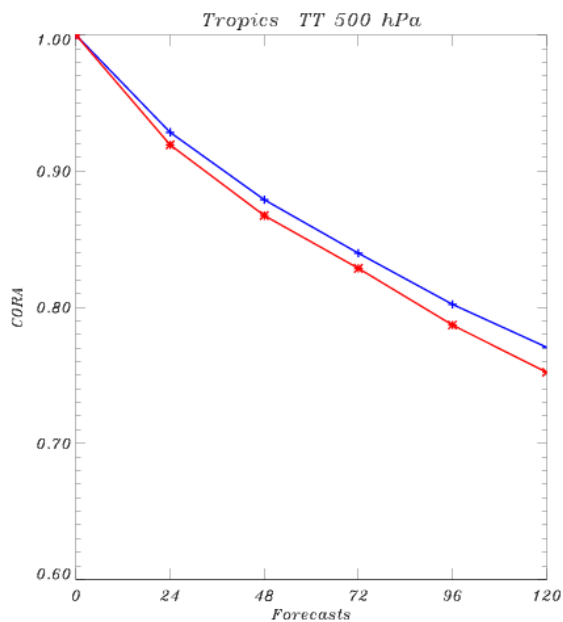
A First 4D-Var Assimilation Cycle Validation Against Analyses Tropics Temperature Anomaly Correlation

Control
Experiment

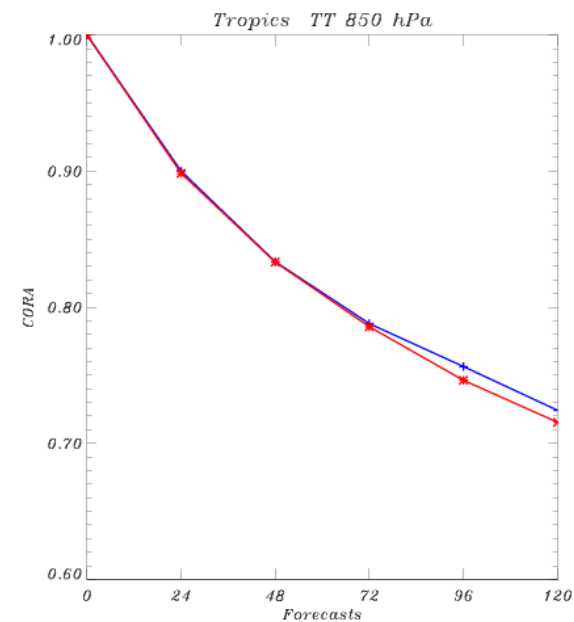
200 hPa



500 hPa



850 hPa



A First 4D-Var Assimilation Cycle : Lessons Learned From First 4dvar Experiment (and Others)

- A positive impact was demonstrated locally in North America.
- Some channels selected in both control and test experiments (extra stratospheric channels and IASI water vapor channels) are problematic and could be responsible for some of the observed problems.
- The constant bias correction used in the cloudy experiment 1 is sub-optimal. Furthermore a air mass predictor based bias correction was shown to improve our clear radiance assimilation and is also suitable for cloudy radiances.
- Some channels far (spectrally) from the $15 \mu\text{m CO}_2$ band seem to be problematic from their O-F and O-A statistics.
- The extra data volume was relatively small and could be increased by decreasing our threshold on cloud effective fraction from 0.9 to 0.75.

A Second 4D-Var Assimilation Cycle: Quality Control Criteria for Cloud-affected Radiances Assimilation Experiment 2

- Assimilation of cloudy radiances above sea only (slightly revised criteria)
- ***Restriction of the assimilation of cloud-affected radiances to the 15 μm longwave temperature sounding channels***
- **$P_s - 100 \text{ hPa} < P_c < 250 \text{ hPa}$**
- ***Restriction to close to overcast situations ($N_\varepsilon > 0.75$)***
- Exclusion of situations with temperature inversion leading to an ambiguous solution for the CO_2 slicing algorithm
- Restriction to situation where the solution of the CO_2 slicing is well defined ($\sigma_{P_c} < 50 \text{ hPa}$, $\sigma_{N_\varepsilon} < 0.1$)
- Criteria on cloud phase related to emissivity model no longer necessary if cloudy assimilation is restricted 15 μm channels

A Second 4D-Var assimilation cycle: Description

Winter 2008/2009

- Bias correction from $A*BT+B$ to air mass predictors
- **Reduced Spatial thinning (250 km → 150 km)**
- **Control 2 experiment** ad before except for:
 - AIRS infrared radiances (122 channels)
 - **IASI infrared radiances (82 channels)**
- **Test 2 experiment:** same but with assimilation of AIRS and IASI in cloudy mode

Conclusions

- EC assimilation system is extended to assimilate cloudy radiances in 4D-Var mode
- The assimilation is robust and the additional computational cost is modest
- The system takes into account the spectral variation of cloud optical properties
- Results of first 4D-Var assimilation experiments (3 weeks) indicate a mix of slightly positive and negative impacts
- New assimilation experiments currently running

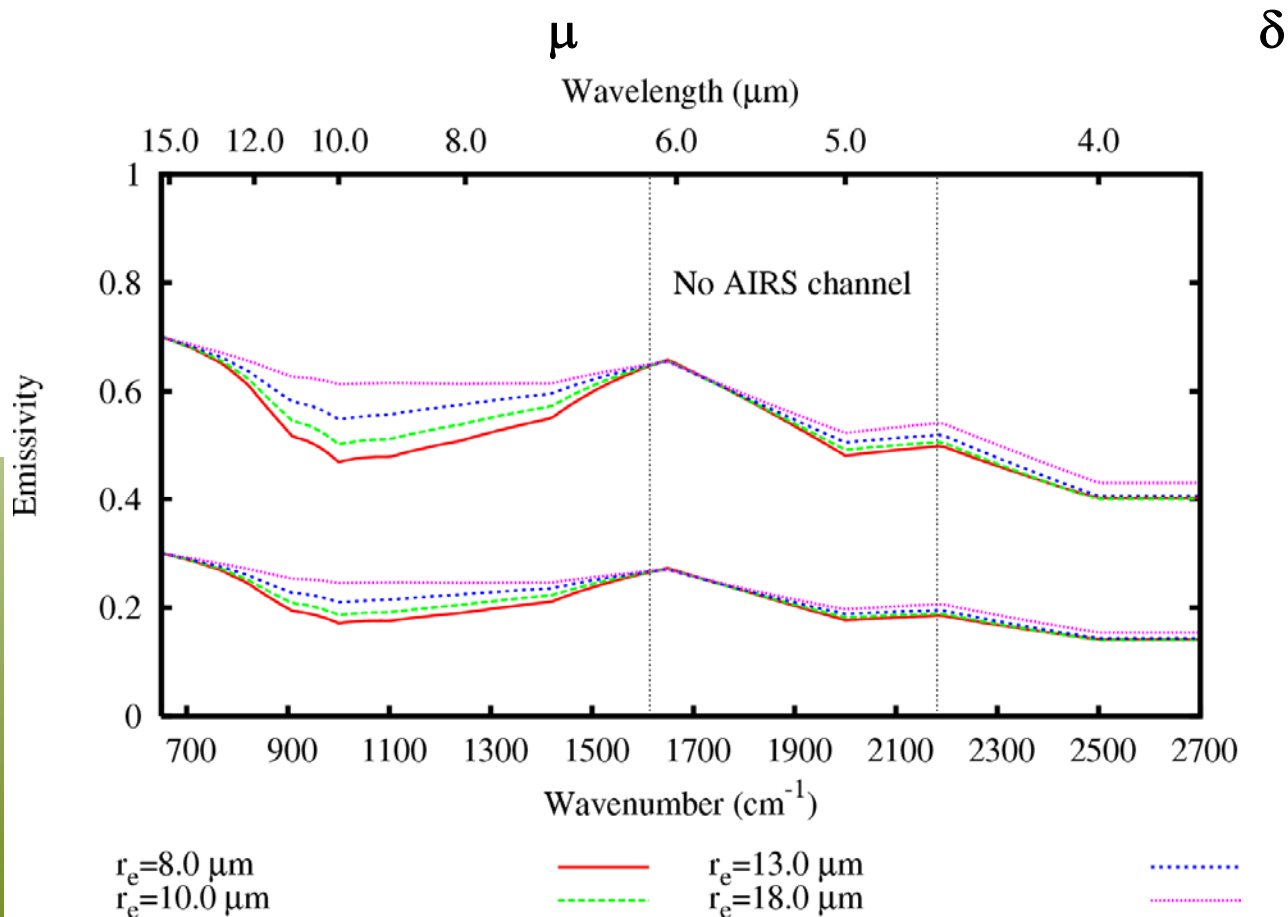
SPARE SLIDES



Details of AIRS and IASI Channels Selected for Assimilation

cm ⁻¹	Spectral bands	AIRS	IASI
650 – 770	Temperature Sounding (CO2 Band)	20 + 37	65
770 – 980	Surface and cloud properties	6	19
1000 – 1070	Ozone sounding	0	0
1070 – 1150	Surface and cloud properties	4	0
1210 – 1650	Water vapor temperature sounding	33	55
1650 – 2100	Water vapor temperature sounding	0	11
2100 – 2150	CO column amount	0	0
2150 – 2250	Temperature sounding	9	0
2350 – 2420	Temperature sounding (CO2 Band)	15	0
2420 – 2700	Surface and cloud properties	0	0

Examples of Cloud Emissivity Spectra



Examples of Cloud Emissivity Spectra

