



Overview of the assimilation of microwave imagers and humidity sounders observations within clouds and precipitation

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

Philippe Chambon ¹, Alan Geer ², Niels Bormann ², Katrin Lonitz ², Stefano Migliorini ³, Brett Candy ³, Kim Min-jeong ⁴, Masahiro Kazumori ⁵, Kazumasa Aonashi ⁶, Ziad S Haddad ⁷, Marylis Barreyat ¹, Jean-François Mahfouf ¹, Thomas Fiolleau ⁸, Rémy Roca ⁸, Rohit Mangla^{9,1}

1. CNRM, Météo-France & CNRS, France ; 2. ECMWF, UK ; 3. UK Met-Office, UK ; 4. GMAO, NASA, USA ; 5. JMA, Japan ; 6. MRI, JMA, Japan ; 7. JPL, NASA & CalTech, USA ; 8. LEGOS, France ; 9. IIT Bombay, India



2. What impacts are we getting from these observations?

- On large scale forecasting scores
- On extreme events forecasts
- On precipitation forecasts

3. What are the current limitations and challenges?

- Observation operator and radiative properties of hydrometeors
- Representation and observation of sub-grid cloud variability
- Representation of cloud life cycle within NWP models and possible link with saturation effects



2. What impacts are we getting from these observations?

- On large scale forecasting scores
- On extreme events forecasts
- On precipitation forecasts
- 3. What are the current limitations and challenges?
 - Observation operator and radiative properties of hydrometeors
 - Representation and observation of sub-grid cloud variability
 - Representation of cloud life cycle within NWP models and possible link with saturation effects





humidity cross-track sounders









In clear sky, both polarizations are often used,

but within clouds, fully polarized fast radiative transfer models are not <u>yet</u> available and only surface effects are taken into account which mean that the information content of this pairs of channels is currently under used

(but one question is if current NWP models can really take benefit from this H-V signal, ~ related to particle shapes/orientations)



Channels not assimilated yet:

- Low resolution (complex beam filling effects)
- Modeling difficulties in precipitation and surface emissivity

=> But research has been done on the 10 GHz !

model resolution: $40 \text{ km} \times 40 \text{ km}$ (T511) data between 30S and 30N, August 2013





From Lonitz et al., (e.g. in IPWG 2014)

- Importance of spatial resolution
 - Fall speed parametrization

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

...



2. What impacts are we getting from these observations?

- On large scale forecasting scores
- On extreme events forecasts
- On precipitation forecasts
- 3. What are the current limitations and challenges?
 - Observation operator and radiative properties of hydrometeors
 - Representation and observation of sub-grid cloud variability
 - Representation of cloud life cycle within NWP models and possible link with saturation effects

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts



- The satellite instruments for which the assimilation of cloudy and rainy observations are not necessarily the same across the experiments, nor periods or verification domains
- ⇒ The examples which will be given are illustrations of the achievements of the community for the assimilation of microwave data in all weather conditions, but not meant to be intercompared





⇒ Impacts of both clear and cloudy sky



⇒ Impacts of cloudy sky

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts



- The satellite instruments for which the assimilation of cloudy and rainy observations are not necessarily the same across the experiments, nor periods or verification domains
- ⇒ The examples which will be given are illustrations of the achievements of the community for the assimilation of microwave data in all weather conditions, but not meant to be intercompared
- The impacts of a given sensor in an all-sky context is now often reported as the impact of both clear sky and cloudy sky observations
- \Rightarrow A good sign that assimilating cloudy and rainy observation is becoming more standard
- \Rightarrow But, does not help to specifically quantify the impact we are deriving from the clouds





⇒ Impacts of both clear and cloudy sky



 \Rightarrow Impacts of cloudy sky



Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts



ECMWF

All-sky radiances sensitive to water vapour, cloud and precipitation are now one of the most important observation types within the ECMWF system



4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of A. Geer)

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

2. What impacts are we getting from these observations?

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts



- Denial experiments compared to a full system for:
 - Conventional observations, MW radiances, IR sounders, GPSRO
- Periods: 1 June 30 September 2016; 1 December 2017 31 March 2018; (ie 2 x 4 months)





AMVs,

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts



ECMWF FC

Focus on the impact of observations from 9 instruments affected by clouds and precipitation, in a symmetric way (first guess affected as well as affected obs)



(Courtesy of A. Geer)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts





Experiments of MHS all-sky assimilation

A new augmentation error strategy

 $\sigma_i = \sigma_i^{clr} + a_i \, LWP + b_i \, IWP$



- Score card results for a trial experiment in winter 2018-2019. Green (purple) triangles denote improvements (degradations) proportional to their size (maximum size here represents a 20% skill change). Shading denotes statistical significance. data set.
- Overall 0.12% and 0.18% RMSE reduction wrt observations and ECMWF analyses, respectively. Consistent and significant improvements are found particularly in extratropical wind and temperature forecast skill.

% Difference (allsky-test vs. P543-CTRL) - overall 0.12% RMSE against observations for 20181215 to 20190228

max = 20																
NH_PMSL		·	•		•		٠	•	•					•		surf
NH_W250		•	•									11		1		AMDARS
NH_W500	•									•			•	•		sondes
NH_W850	1															Satwind
NH_W10m											•					surf
NH_T250												•				sondes
NH_T500																sondes
NH_T850	•															sondes
NH_T_2m														•		surf
NH_Z250		•												•		sondes
NH_Z500	•	٠	•	•										•		sondes
NH_Z850	•	٠	•									•				sondes
TR_W250			•							•	•	•	۷	•		AMDARS
TR_W500	•						÷		•							sondes
TR_W850																Satwind
TR_W10m		·														surf
TR_T250	•		•	•						•			٠	٠		sondes
TR_T500				•						•			•			sondes
TR_T850						•					•					sondes
TR_T_2m							·									surf
SH_PMSL	•															surf
SH_W250			•						۵							AMDARS
SH_W500	•															sondes
SH_W850								•		•	•					Satwind
SH_W10m							•									surf
SH_T250												•	۲			sondes
SH_T500			•						•				٠			sondes
SH_T850									•	•				•		sondes
SH_T_2m													•			surf
SH_Z250	•								٠	•						sondes
SH_Z500	۷	٠							•	•						sondes
SH_Z850	•							۲						٠		sondes
	0+	9+	12	24	36	48	60	72	84	96	08	20	32	44	68	
	÷	÷	÷	Ť	÷	÷	÷	+	Ť	+	+1(+	Ŧ	17	Ē.	
											Н	F	F	F	F	
	REF: observations															
					•						u					

% Difference (allsky-	test vs.
PS43-CTRL) - overall	0.18%
RMSE against ecanal for 20181	215 to 20190228

max = 20																
NH_W250							•		1		1	1	1	1		anl
NH_W500										•			•			anl
NH_W850										•						anl
NH_W10m								·		•						anl
NH_T250										•		•				anl
NH_T500																anl
NH_T850																anl
NH_T_2m																anl
NH_Z250			۷	1						•	•					anl
NH_Z500			•				•	•		•						anl
NH_Z850					•							•	•			anl
TR_W250												•	•	•		anl
TR_W500																anl
TR_W850																anl
TR_W10m		•	•	٠		•										anl
TR_T250			•													anl
TR_T500											•	•		•		anl
TR_T850						•	۳	٠	٠	٠	·	•		•		anl
TR_T_2m		•	·													anl
SH_W250										•						anl
SH_W500																anl
SH_W850										•						anl
5H_W10m									•	•						anl
SH_T250																anl
SH_T500																anl
SH_T850			٠	•	·											anl
SH_T_2m		٠	٠	٠	•	•										anl
SH_Z250			•													anl
SH_Z500								•		•						anl
SH_Z850										•			•			anl
	T+0	T+6	T+12	T+24	T+36	T+48	T+60	T+72	T+84	T+96	+108	+120	+132	+144	+168	
		RI	EF	=:	Ε	C	N	1\	N	F	a	n	a	y	si	S



4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Stefano Migliorini and Brett Candy)

RMSE

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts





Change of accuracy of 500 hPa geopotential height forecast

From July 1 to September 30, 2017



4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Masahiro Kazumori)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts





All-Sky GPM Data in GEOS Weather Forecasts

On 11 July 2018, Global Precipitation Mission (GPM) Microwave Imager (GMI) observations were implemented into the GMAO Forward Processing (FP) system

- Assimilation of GMI radiances in near-real-time
- Active assimilation under all-sky situations, eliminating previous limitation to those unaffected by clouds and precipitation

Advanced methods were incorporated to optimize the use of these observations

- Adaptive thinning in the presence of clouds and precipitation (left, where warm colors indicate increased convective activity)
- Advances to underlying radiative transfer algorithm
- Incorporations of ice and liquid clouds and precipitation into the solution

GMI Observations (1-Normalized 37 GHz TB polarization difference)



4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Min-jeong Kim)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts





All-Sky GPM Data in GEOS Weather Forecasts

The addition of GMI radiances had the largest impact in the Tropics

- Specific humidity was significantly improved in the short term (0-72 hour) forecasts (right, hatched indicates significance)
- Though not shown, similar improvements were seen in mid and lower tropical tropospheric temperature and winds

Other modeling and initialization improvements included in the FP upgrade retained these improvements into the medium range





The GMI improvement is consistent with results seen via the Forecast Sensitivity to Observation Impact (FSOI) metric

- FSOI is a metric of how each observation contributes to the reduction (negative) or increase (positive) of the 24 hour forecast error
- GMI is seen to have the highest impact per observation of all the radiance observation types

(Courtesy of Min-jeong Kim)





Impacts of assimilating SAPHIR in cloudy and rainy areas with the 1D-Bayesian + 4D-Var technique within ARPEGE over a 4-month period (July to October 2018)



2. What impacts are we getting from these observations? Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

 \bigcirc **METEO** FRANCE

Impacts of assimilating 4 MHS in cloudy and rainy areas with the 1D-Bayesian + 4D-Var technique within ARPEGE up to 60°N over a 3-month period (July to September 2019)

- Positive impacts of microwave cloudy and rainy observations have been demonstrated within several systems using various methodologies, for both microwave imagers and humidity sounders
- These impacts are significant from the short range and up to 5 to 10 days

=> Can we measure the impact of cloud and precipitation observations onto cloud and precipitation forecasts themselves?

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

GMI contributes to improved forecasts of hurricane / cyclone Leslie (2018)

Forecast from 11th October, 12 UTC is incorrect - Leslie's position is around 1000km out

Forecast from 12th October, 00 UTC is correct – Leslie hits Portugal overnight on 13-14th October

- Forecasting the landfall in Portugal of hurricane Leslie remained challenging 60 hours ahead but the 48 hour forecast began to capture the true evolution of the storm.
- On this occasion, GMI was in the right place to give the biggest satellite contribution to the improved forecast (drifting buoys contributed significantly more, but were the only observation giving more impact than GMI).

e cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of A. Geer)

ECMWF

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

All basins, homogeneous samples,

1 June – 30 September 2016; 1 December 2017 – 31 March 2018; (ie 2 x 4 months) Note: Spatial resolution TCo399 (~28km) much lower than operations

(Courtesy of N. Bormann)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

All basins, homogeneous samples,

1 June – 30 September 2016; 1 December 2017 – 31 March 2018; (ie 2 x 4 months) Note: Spatial resolution TCo399 (~28km) much lower than operations

(CUSU)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Impact of SAPHIR cloudy radiances on hurricane forecasts: Examples of Typhoon Shanshan and Hurricane Beryl

North West Pacific basin

METEO FRANCE

+72h forecasts initialized on August 5th, 2018

North Atlantic basin +72h forecasts initialized on July 7th, 2018

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Impact of SAPHIR cloudy radiances on hurricane forecasts:

Impact for 16 hurricanes over several basins for a sample of 432 hurricane forecasts

(c) Reduction of error on track for hurricanes: Beryl (ATL), Chris (ATL), Maria (NWP), Fabio (NEP), Ampil (NWP), Wukong (NWP), Shanshan (NWP), Jongdari (NWP),Hector (NEP), John (NEP), Florence (ATL), Helene (ATL), Isaac (ATL), Kirk (ATL), Michael (ATL), Jebi (NWP) (16 hurricanes - 432 forecasts)

Reduction of error of ~6% in average over the life cycle of the 16 hurricanes.

METEO FRANCE

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Improved prediction at TC developing stages

The heat release from water vapor condensation is a source of TC development. **Rapid Intensification**^{*} of TC was predicted in the all-sky assimilation experiment. Water vapor analysis in cloudy conditions would be improved.

TEST

* Decrease in the central pressure of TC at least 30 hPa in a 24-hour period.

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Masahiro Kazumori)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

All-sky assimilation improved TC track predictions for all ocean areas.

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Masahiro Kazumori)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

160

All-sky assimilation improved TC track predictions in 2017

(Courtesy of Masahiro Kazumori)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

- Positive impacts of microwave cloudy and rainy observations onto hurricane forecasting have been demonstrated within several systems using various methodologies, for both microwave imagers and humidity sounders
- These impacts are very robust for track forecasting. Some cases of impacts on rapid intensification forecasting have also been reported
- => Do we also see impacts onto precipitation forecasts of smaller scale systems?

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

CRM

- JMA NHM: 5km, (481x481x50)
- Predicts 6 types of water subsistence

Ensemble forecasts

- Control run starts with initial and boundary data made from GANAL.
- 52 members
- Initial and boundary perturbations are made from the weekly ensemble forecasts (GSM).

EnVAR using the Neighboring Ensemble method

• Hydrometeors and vertical velocities in control variable

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Kazumasa Aonashi)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

1 2 4 6 8 10 15 20 30 40

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Kazumasa Aonashi)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

For global models and some regional models running over geographical domains where the ground measurement network is sparse, the question of what reference using for validating model forecast arise.

GPCC Monitoring Product Version 6 Gauge—Based Analysis 1.0 degree number of stations per grid for October 2019

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Chris Kidd)

2. What impacts are we getting from these observations? Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

Satellite-based precipitation products haven proven to be useful in the case of lack of good quality ground rainfall estimate \Rightarrow quite a few different products exist within the community \Rightarrow IPWG: <u>http://ipwg.isac.cnr.it</u>

CULU

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

ECMWF

METEO

FRANCE

Baseline experiment:

denial of MHS in the tropics and SAPHIR within the ECMWF all-sky system

(Chambon and Geer, 2017)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

ECMWF

METEO

FRANCE

Baseline experiment:

denial of MHS in the tropics and SAPHIR within the ECMWF all-sky system

Impact of all-sky data sometimes negative, perhaps for this case due to the complex land/sea mask in this area of the globe

(Chambon and Geer, 2017)

Context / On large scale forecasting scores / On extreme events forecasts / On precipitation forecasts

METEO FRANCE Impact of 9 instruments in all-sky onto tropical ECMWF precipitation forecasts with respect to TRMM 3B42 precipitation estimates

CECMWF

Score: Fractions Skill Score Period: May to August, 2015

=>In average 2 to 3% improvement of the FSS up to 5 days ahead

(Geer et al., 2018)

- **1.** Status of the constellation of microwave sounders and imagers: Which frequencies are we currently using/not using within clouds?
- 2. What impacts are we getting from these observations?
 - On large scale forecasting scores
 - On extreme events forecasts
 - On precipitation forecasts

- Observation operator and radiative properties of hydrometeors
- *Representation and observation of sub-grid cloud variability*
- Representation of cloud life cycle within NWP models and possible link with saturation effects

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

The quality of the obs operator we are using in cloud and precipitation partly rely on the quality of Single Scattering Properties we use

One of the very popular scattering databases, both used within the DA community (in particular thanks to Geer and Boardo, 2014) and within the precipitation retrievals community (Ringerund et al., 2019)

- \Rightarrow Liu, 2008 (BAMS)
- $\Rightarrow\,$ Frequencies covered from 13.4 to 340 GHz

New databases available:

- \Rightarrow ARTS, Eriksson et al., 2018
- \Rightarrow Frequencies covered 1 to 886 GHz
- \Rightarrow 32 shapes including aggregates

Since the mid 90s and the first scattering databases available for the community, the number of databases has significantly increased.

A coordination effort is ongoing within the IWSSM/IPWG community to standardize the databases (both scientifically and technically)

(Kneifel et al., 2017, BAMS)

Observation operator / Observation of sub-grid cloud variability **/** Representation of cloud life cycle

Looking for the best fit of a given combination of particle shape/particle size distribution for a large range of channels like in the study by Geer and Board in 2014 may become "a nightmare" in the next years with this increase of number of scattering database

=> Need for new strategies?

(Geer and Baordo, 2014)

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

A fine modeling of sub-grid cloud variability is usually required to well simulate brightness temperatures

 \Rightarrow Easier to spot with space radars and their vertical discretization

Time (HH:MM:SS)

CIRM

Overestimation of 94GHz reflectivity simulations when using the effective cloud fraction approach of Geer et al. (2009)

More realistic simulations when using a full profile of precipitation fraction within the calculations

(PhD thesis of Rohit Mangla)

4th workshop on assimilating satellite cloud and precipitc

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

The inconsistency of horizontal resolutions across channels remains a challenge to fully exploit current and future sensors

CIMR: Copernicus Imaging Microwave Radiometer **Copernicus High Priority Candidates** https://www.esa.int/Applications/Observing the Earth/Copernicus/Copernicus High Priority Candidates

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

Superobbing of observations at the lowest resolution across channels is still a very relevant strategy, but will we need a need strategy in the next years with the increase in resolution of NWP systems? Low Cloud Mid-Level Cloud In the IR, high resolution imagers are often used to evaluate the non uniform beam filling (eg. IASI and AVHRR, Farouk et al., 2019) High Cloud Would using high resolution imager information be useful as well for better exploiting microwave observations within (d) clouds? Deconvolution of observations across channels? Steward, Haddad et al., 2019

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

 It is likely that a model forecast can benefit of frequent and high resolution cloud and precipitation observations through Data assimilation only if the model forecast itself can resolve the scales and reproduce the variability of observations in space and time.

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

- Some saturation in terms of number of microwave imagers that can be assimilated has been reported in the past, was it related somehow to the representation of cloud life cycle?
- It does not seem to be the case for sounders and an all-sky approach, but is it really the case for cloudy observations?

One study was performed in collaboration between Météo-France and LEGOS/CNRS to evaluate the representation of cloud life cycle with the AROME OM (Faure et al., 2020), focusing on tropical convection from an IR perspective. The study uses a cloud tracking algorithm called TOOCAN (Fiolleau and Roca, 2013)

AROME Overseas geographical domains in orange/red

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

55°W

Period: August 1st, 2017 – October 10th, 2017 Domain: Caribbean's Observations: GOES-13 TIR Model simulations: 30 minutes images from +3h forecasts from an AROME 3D-Var with 3h cycles Radiative transfer: RTTOV V12- Vidot/Baran ice cloud parametrization

(Courtesy of Thomas Fiolleau)

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

- Similar evolution of the relation lifetime duration vs Maximum size between AROME and observations
- Bias of maximum size ranging between -10 and +10%

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Thomas Fiolleau)

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

4th workshop on assimilating satellite cloud and precipitation observations for NWP / 3-6 February 2020, ECMWF

(Courtesy of Thomas Fiolleau)

Observation operator / Observation of sub-grid cloud variability / Representation of cloud life cycle

(https://tropics.ll.mit.edu)

Future constellation of cubesats with microwave sounders may significantly increase the density of observations, in space and time.

Are our model physics ready to ingest and be constrained very frequently within cloud and precipitation?

If not yet, can we estimate at what stage we currently stand?

Thank you !

