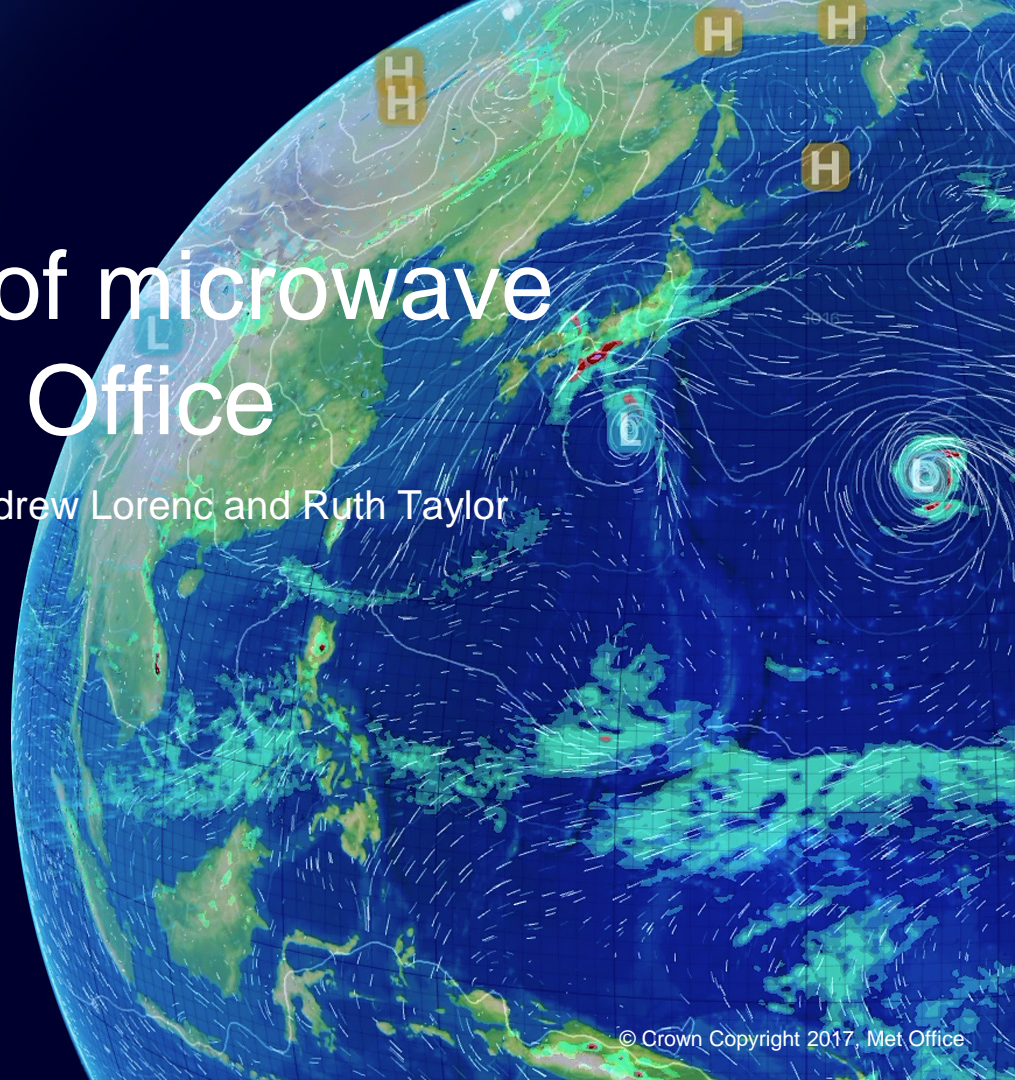


# All-sky assimilation of microwave sounders at the Met Office

Stefano Migliorini, Brett Candy, William Bell, Andrew Lorenc and Ruth Taylor

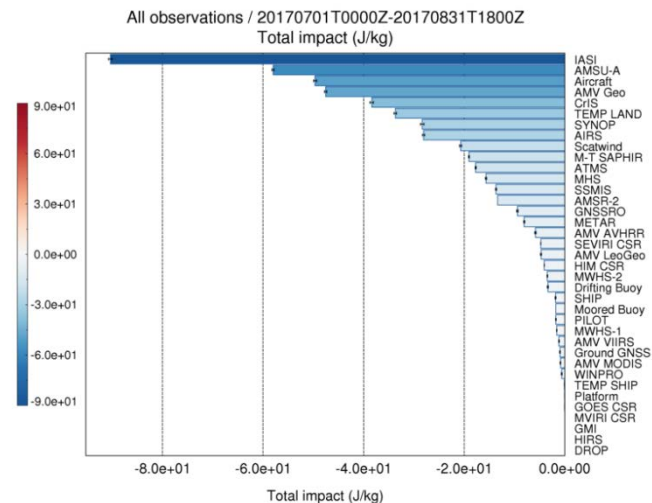
Met Office

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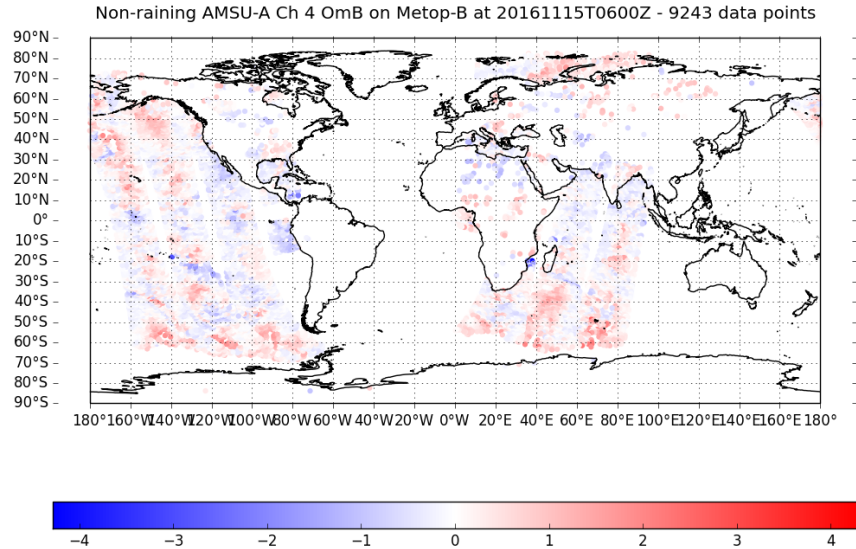
# Motivation

- Microwave sounding radiances are an important source of information to constrain short range forecasts
- AMSU-A radiances provide the second highest impact as measured by the FSOI over a two month period over last summer
- Obs from low peaking channels (Ch 4 and Ch 5) are discarded when significantly affected by cloud
- Strong motivation to move to all-sky assimilation of microwave sounders



# Cloud-affected radiances

- Cloud flags are currently rejecting most of AMSU-A channel 4 data and a significant portion of channel 5 data



# Moisture in VAR

- Model variables:  $u, v, w, \theta, \Pi, \rho, q, q_{cl}, q_{cf}, C_l, C_f, C_t$
- Perturb. forecast (PF) model vars:  $(u', v', w', \theta', \Pi', \rho', q', q_c') = \mathbf{w}'$
- $\mathbf{w}'$  components not independent: we need uncorrelated  $\mathbf{v}_p$  and transform  $\mathbf{U}_p$  such that  $\mathbf{w}' = \mathbf{U}_p \mathbf{v}_p$
- Met Office CVs:  $\mathbf{v}_p = (\psi', \chi', p^A, \mu')$  = stream function, velocity potential, unbalanced pressure, humidity variable
- $\mu'$  proportional to  $rh'_T (q'_T)$  close to (away from) saturation: temperature-sensitive obs preserve cloud when  $\mu'=0$
- Parameter transform  $\mathbf{U}_p$  determines  $q'_T$  from  $\mu'$

# Partitioning the moisture increments (1/2)

- Single moist CV requires an operator to distribute total water increments so as to pass them to obs operator and prognostic models: liquid increments

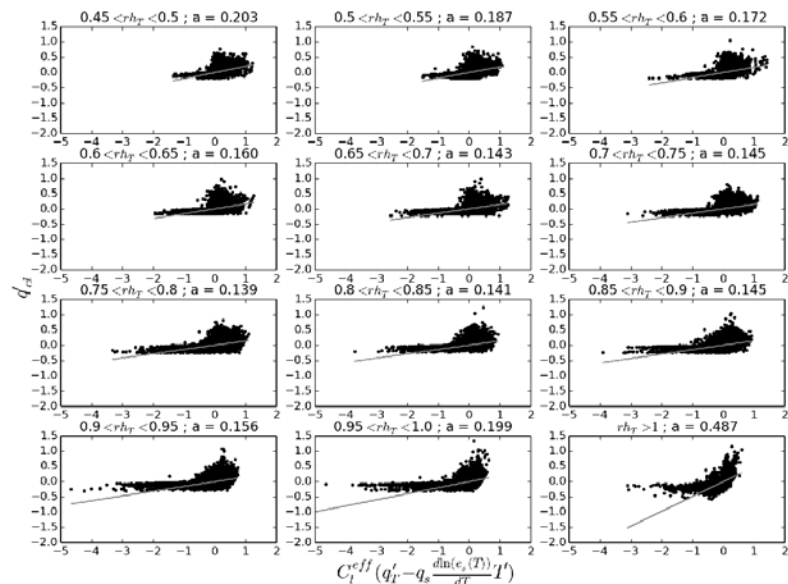
$$q'_{cl} = C_l(q'_T - q'_{cf} - q'_s) \cong C_l(q'_T - q'_{cf} - q_s \frac{\partial \ln e_s}{\partial T} T')$$

$$q'_{cl} \cong \frac{C_l(1-C_f)}{1-C_lC_f} \left( q'_T - q_s \frac{d \ln(e_s(T))}{dT} T' \right)$$

$$C_l^{eff} \cong \frac{C_l(1-C_f)}{1-C_lC_f}$$

$$(q'_{cl})_{diag} \cong a(z_l, \delta_{rh}) q'_{cl}$$

- Migliorini, Lorenc and Bell (2017), QJRMS



# Partitioning the moisture increments (2/2)

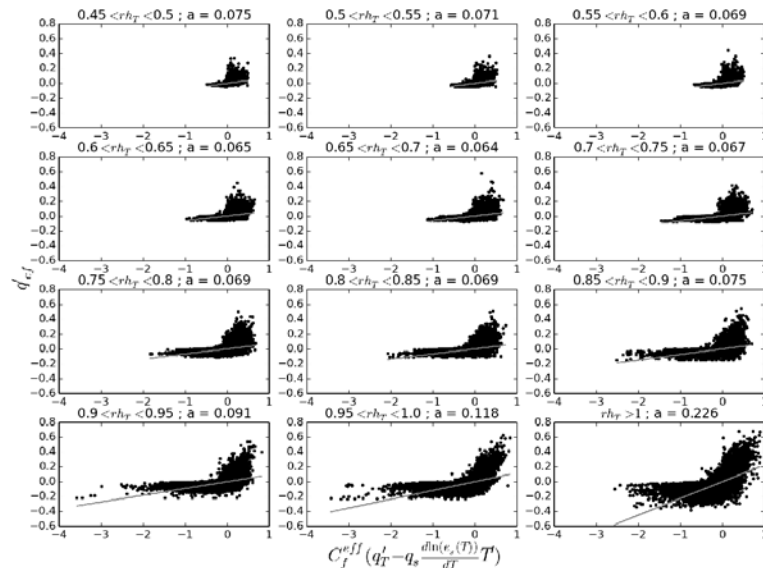
- Single moist CV requires an operator to distribute total water increments so as to pass them to obs operator and prognostic models: ice increments

$$q'_{cf} = C_f (q'_T - q'_{cf} - q'_s) \cong C_f (q'_T - q'_{cf} - q_s \frac{\partial \ln e_s}{\partial T} T')$$

$$q'_{cf} \cong \frac{C_f (1 - C_l)}{1 - C_l C_f} \left( q'_T - q_s \frac{d \ln(e_s(T))}{dT} T' \right)$$

$$C_f^{eff} \equiv \frac{C_f (1 - C_l)}{1 - C_l C_f}$$

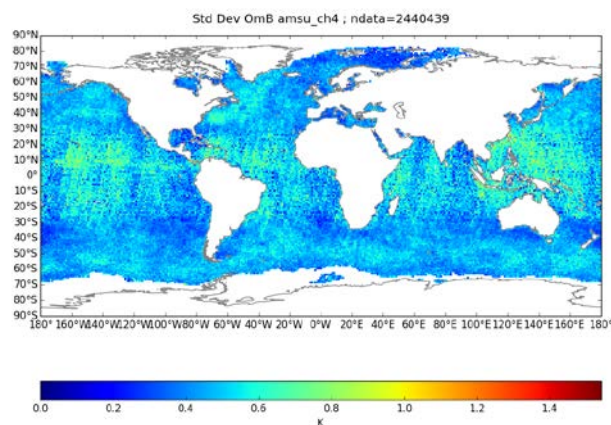
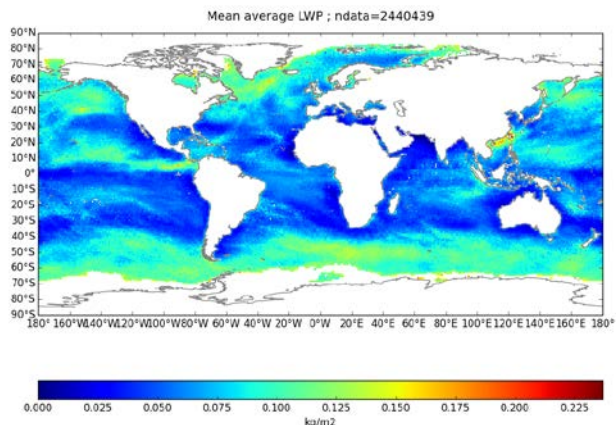
$$(q'_{cf})_{diag} \cong b(z_l, \delta_{rh}) q'_{cf} \quad q' = q'_T - (q'_{cl})_{diag} - (q'_{cf})_{diag}$$



- Migliorini, Lorenc and Bell (2017), QJRMS

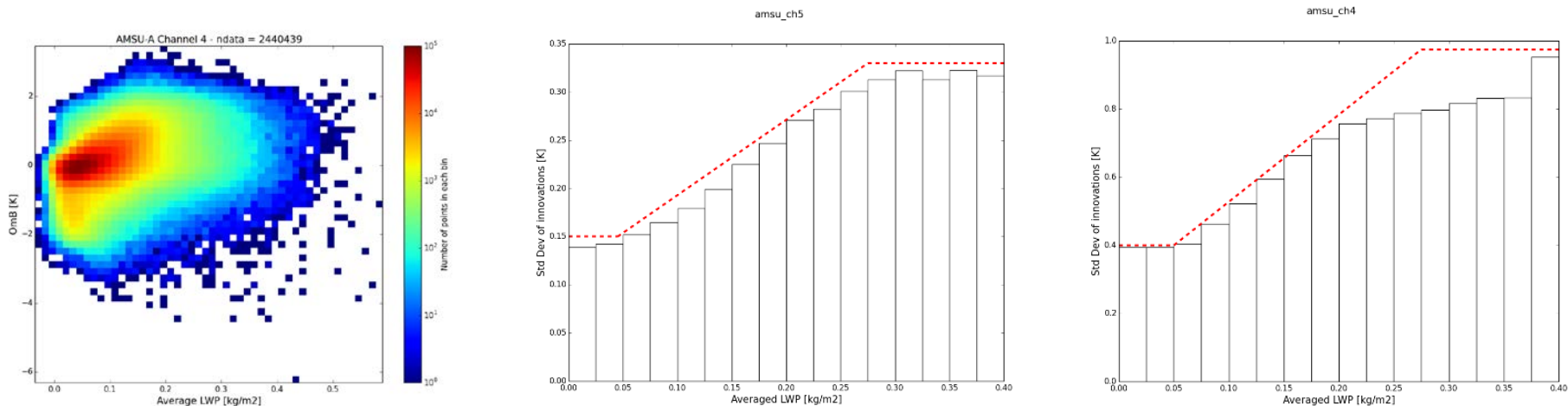
# Uncertainties in the presence of cloud

- A monitoring experiment was set up to evaluate errors for AMSU-A Ch 4 and Ch 5 observations affected by cloud. To this end, the data assimilation system was modified to perform radiance calculations on model rather than on standard levels.
- LWP retrieved from both real and simulated AMSU-A Ch1 and Ch2 observations (Weng et al., 2003)



# Cloud-dependent errors

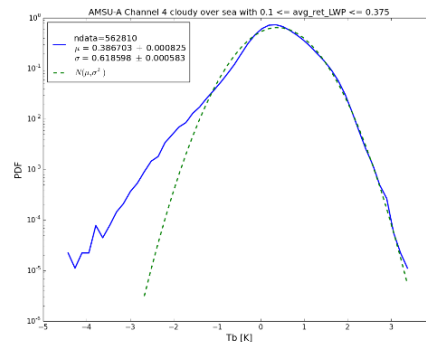
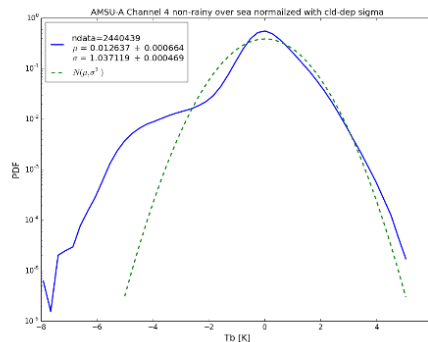
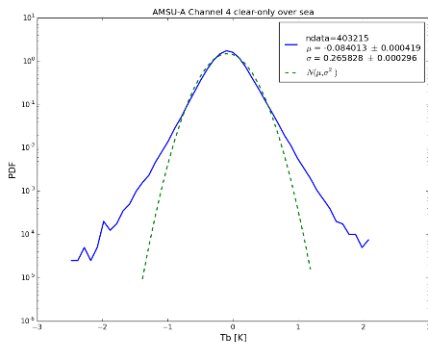
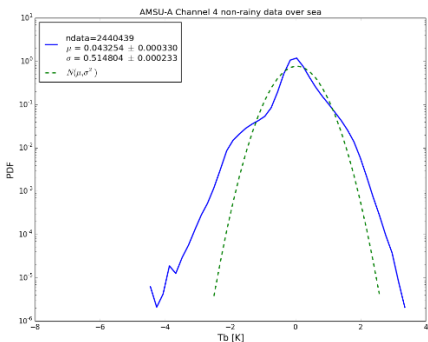
- Evidence of non-linear dependence of the innovation distributions on average LWP
- Also significant biases esp. at low LWP values (but no VarBC corrections on data)
- Stddev of innovations are still well approximated by piece-wise linear relationship in avg LWP





# Innovation distribution

- Innov distrib for non-raining scenes noticeably non-Gaussian (K-L distance from Gaussian:  $d_{KL} = 0.1681$ ) compared to clear-sky only ( $d_{KL} = 0.0336$ ).
- Normalization by cloud-dependent errors still does not ease non-Gaussianities ( $d_{KL} = 0.1629$ )
- Significant improvements for clear plus cloudy scenes with  $0.1 \text{ kg/m}^2 \leq \text{LWP} \leq 0.375 \text{ kg/m}^2$  ( $d_{KL} = 0.0288$ )



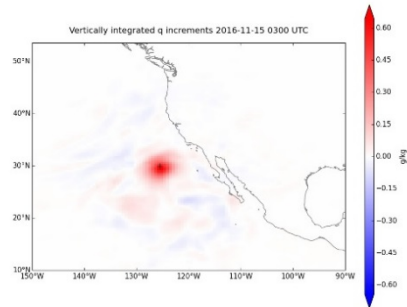
# Single-ob experiment

- Analysis increments from assimilation of a single cloudy scene
- Radiances from MHS Ch3 and Ch4, AMSU-A Ch6 and Ch8 to Ch14 on Metop-B (CTRL) compared to those obtained when AMSU-A Ch4 and Ch5 radiances (normally discarded in the presence of cloud) were also assimilated (Exp)

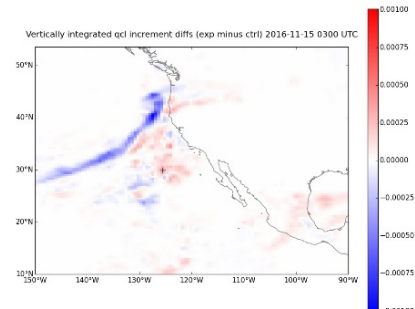
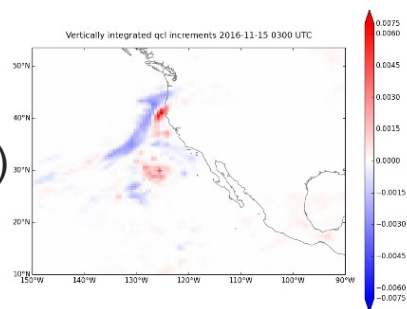
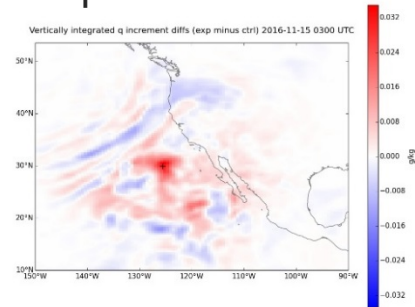
$$\sum_i q'(z_i)$$

$$\sum_i q_{cl}'(z_i)$$

CTRL

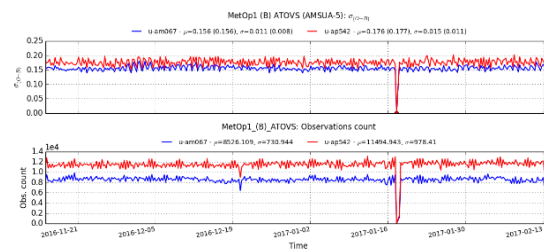
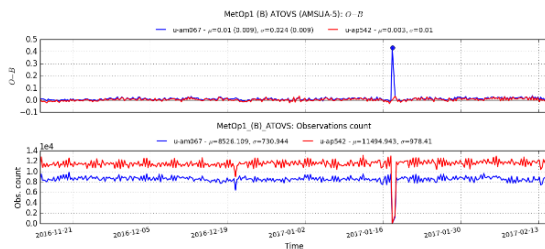
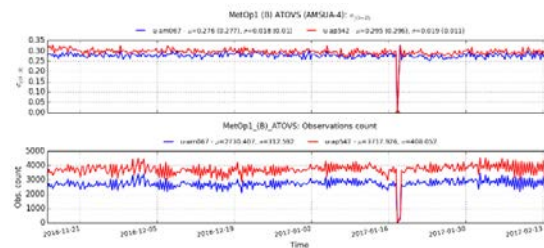
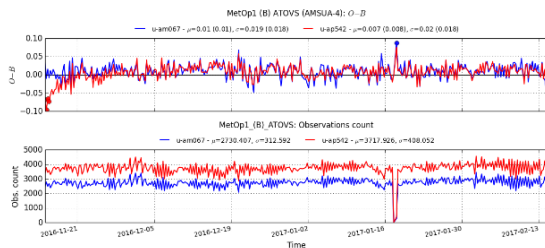


Exp minus CTRL



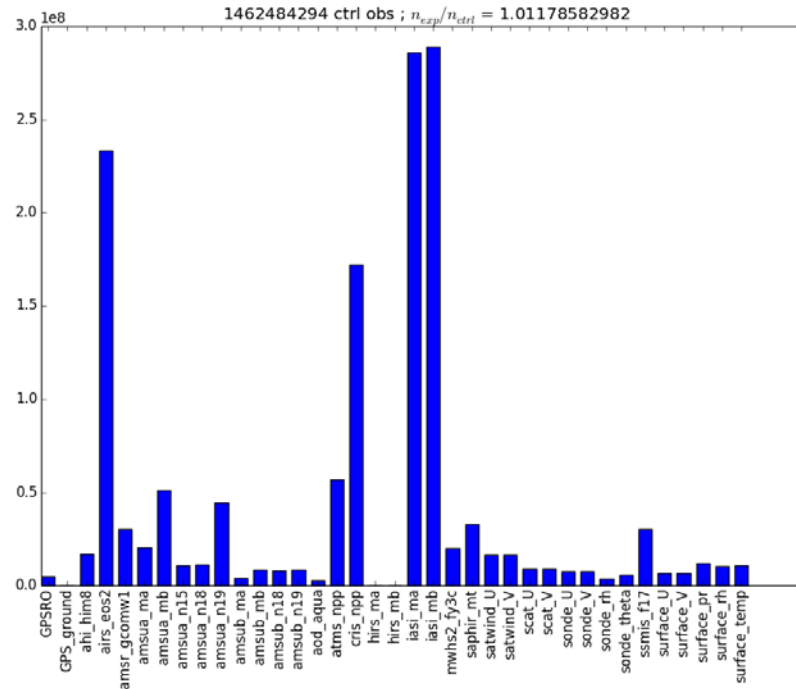
# Trial experiment

- Trial experiment from 15 November 2016 0600 UTC to 20 February 2017 1200 UTC
- RTTOV on model levels; new moisture incrementing operator; non-zero jacobian wrt clw for ATOVS; all-sky (nonprecipitating) AMSU-A Ch5; Ch4 with  $0.1 \text{ kg/m}^2 < \text{LWP} < 0.375 \text{ kg/m}^2$



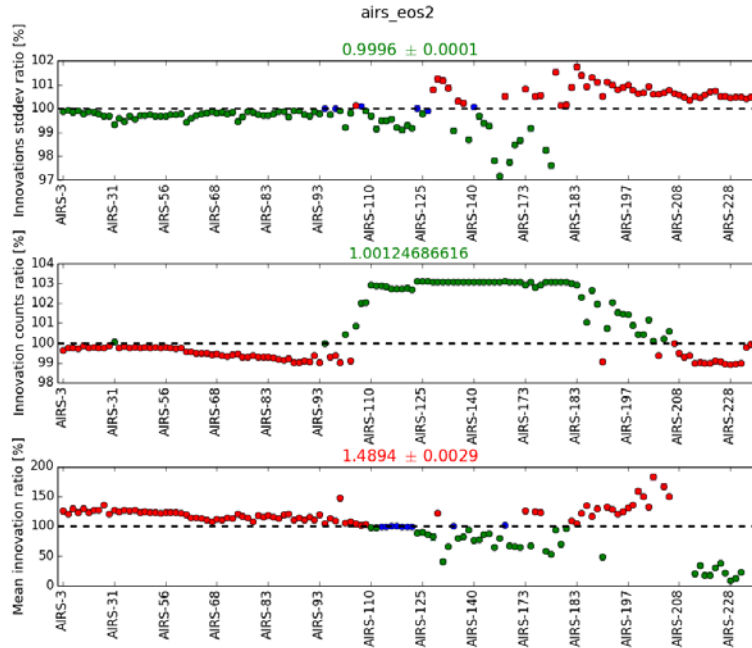
# Trial experiment

- Total number of obs



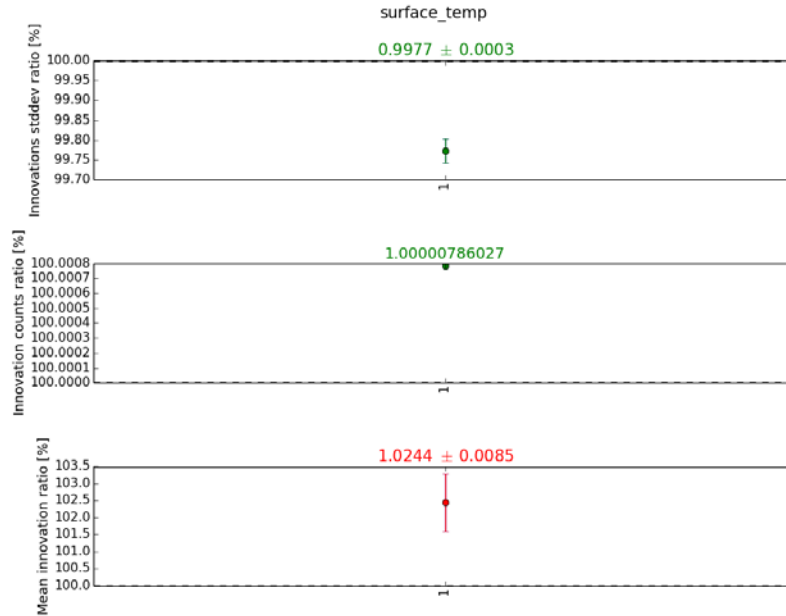
# Trial experiment

- Satellite data innovations



# Trial experiment

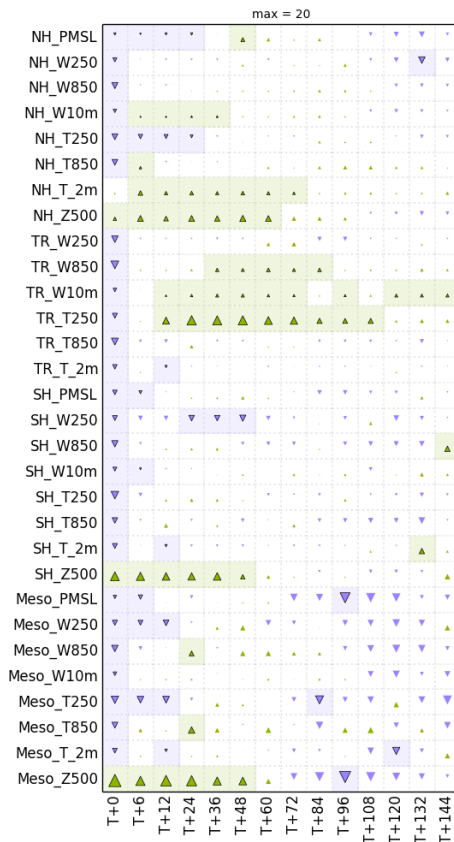
- In situ data innovations



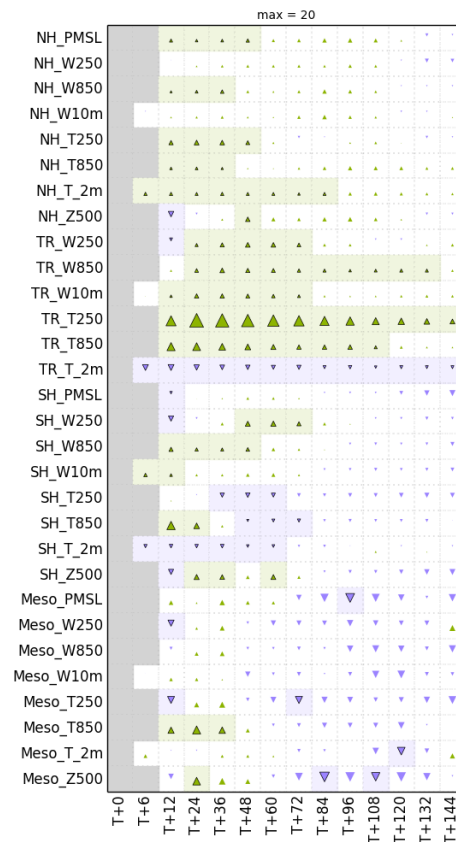
# Score cards

- Change in RMSE (green: smaller than control) against EC analyses (left) and against obs (right)
- Max RMSE diff = max triangle area: 20%
- Shading when diff significant at 0.05 level
- Meso: over the UKV domain

% Difference (all-sky modlevs vs. OS39)  
Change in RMSE against observations for 20161125-20170220



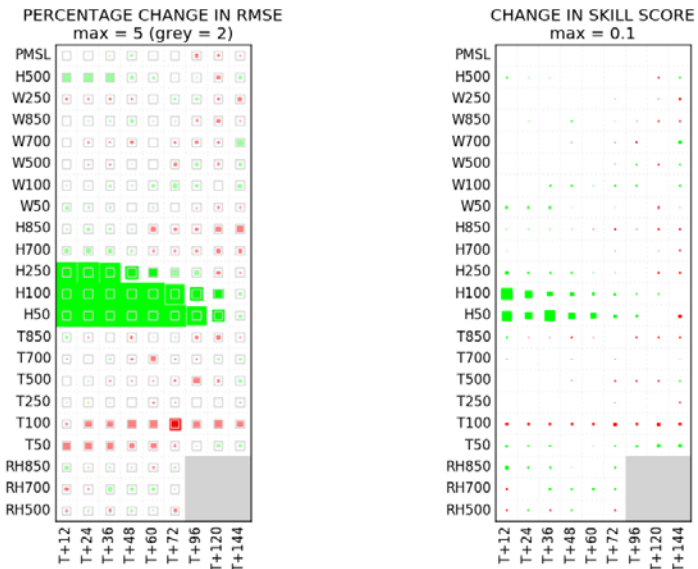
% Difference (all-sky modlevs vs. OS39)  
Change in RMSE against ECMWF analyses for 20161125-20170220



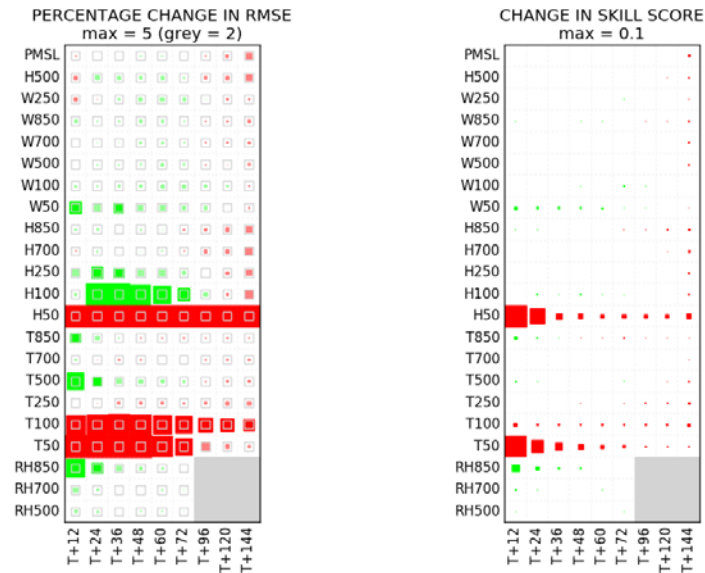
# Verification

- Global NWP index: +0.126% (obs) +0.187%(EC ana)

**VAR TRIAL: all-sky models against CTRL (winter trial)  
VERIFICATION VS OBSERVATIONS  
FROM 20161125 TO 20170220  
SOUTHERN HEMISPHERE**

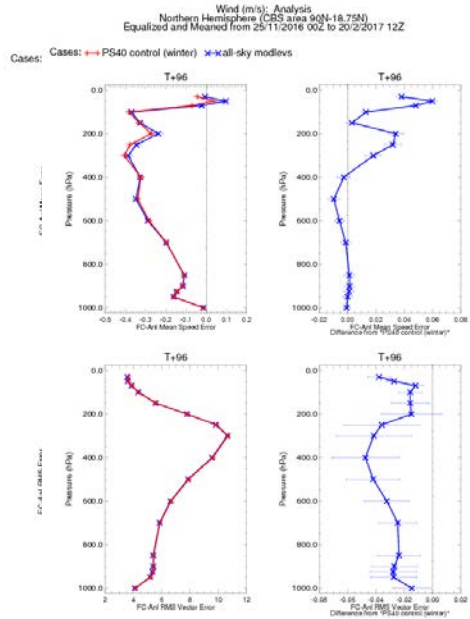


**VAR TRIAL: all-sky models against CTRL (winter trial)  
VERIFICATION VS ANALYSIS  
FROM 20161125 TO 20170220  
SOUTHERN HEMISPHERE**

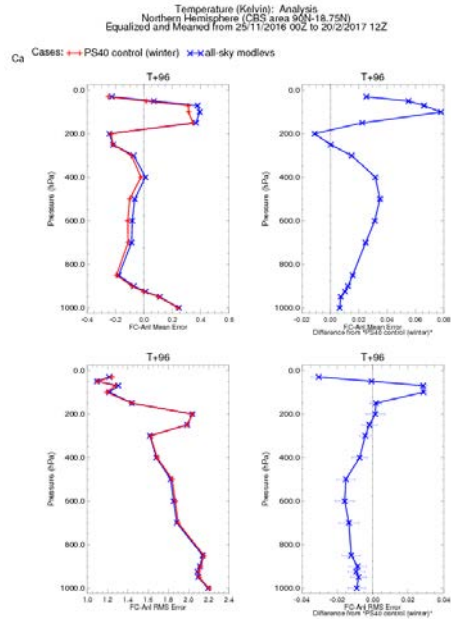




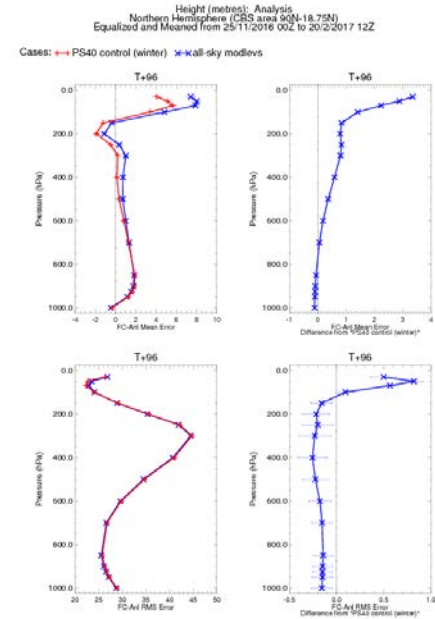
# Verification: EC (NH)



66% error bars calculated using  $S(n-1)^{**}$

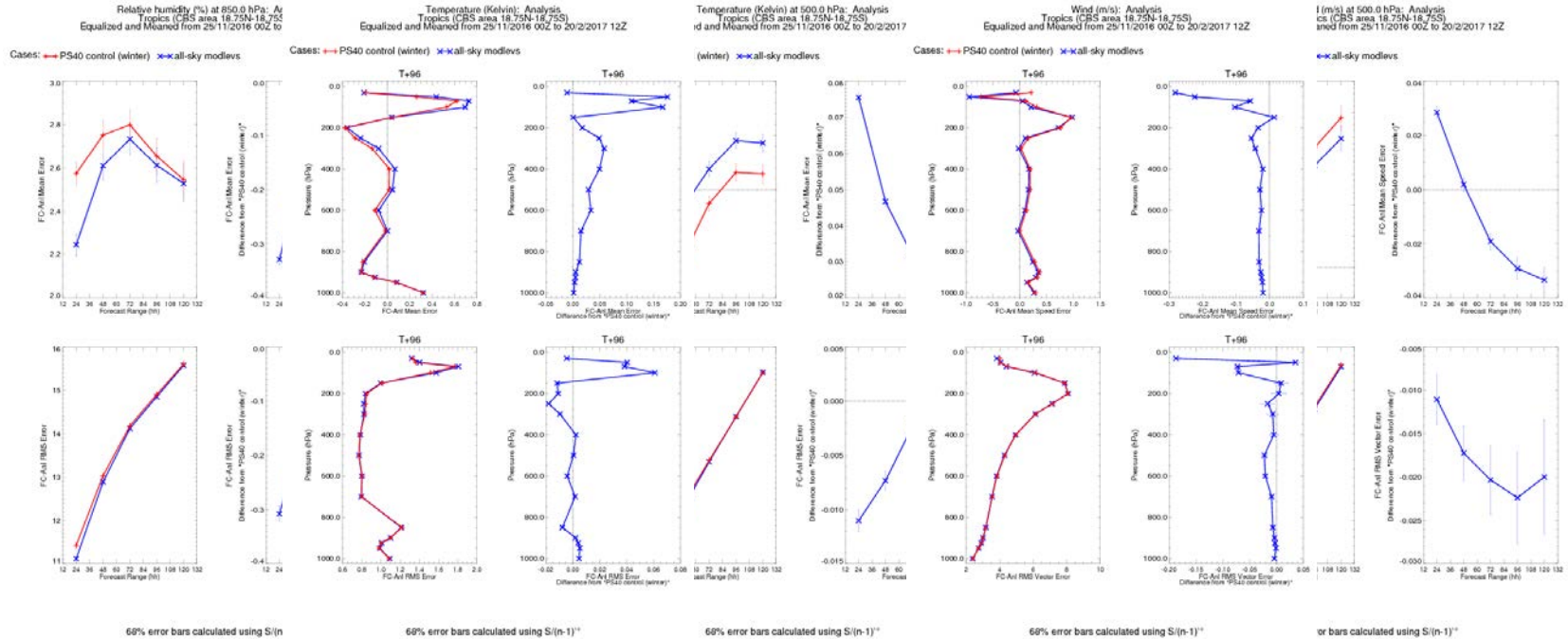


66% error bars calculated using  $S(n-1)^{**}$



66% error bars calculated using  $S(n-1)^{**}$

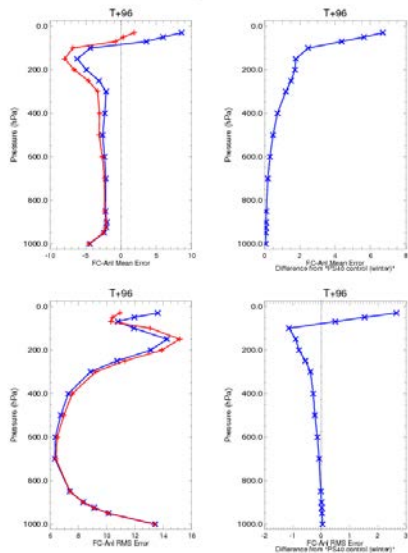
# Verification: EC (TR)



# Verification: EC (SH)

Height (metres): Analysis  
Tropics (CRS area 18.75N-18.75S)  
Equalized and Mianred from 25/11/2016 00Z to 20/2/2017 12Z

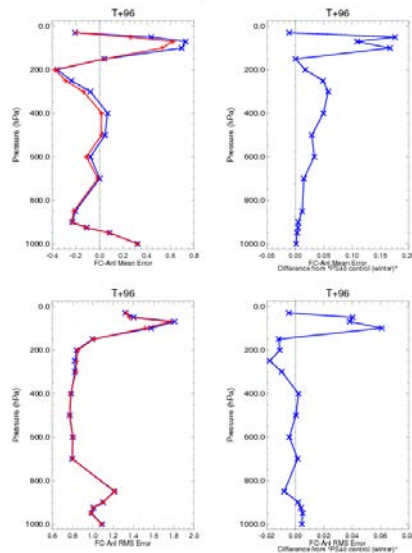
Cases: → PS40 control (winter) ✕ all-sky models



68% error bars calculated using  $S(n-1)^{**}$

Temperature (Kelvin): Analysis  
Tropics (CRS area 18.75N-18.75S)  
Equalized and Mianred from 25/11/2016 00Z to 20/2/2017 12Z

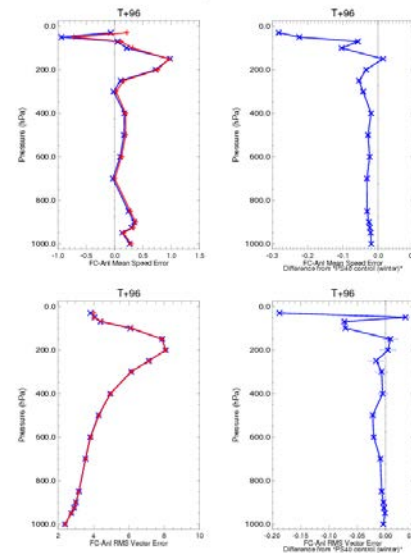
Cases: → PS40 control (winter) ✕ all-sky models



68% error bars calculated using  $S(n-1)^{**}$

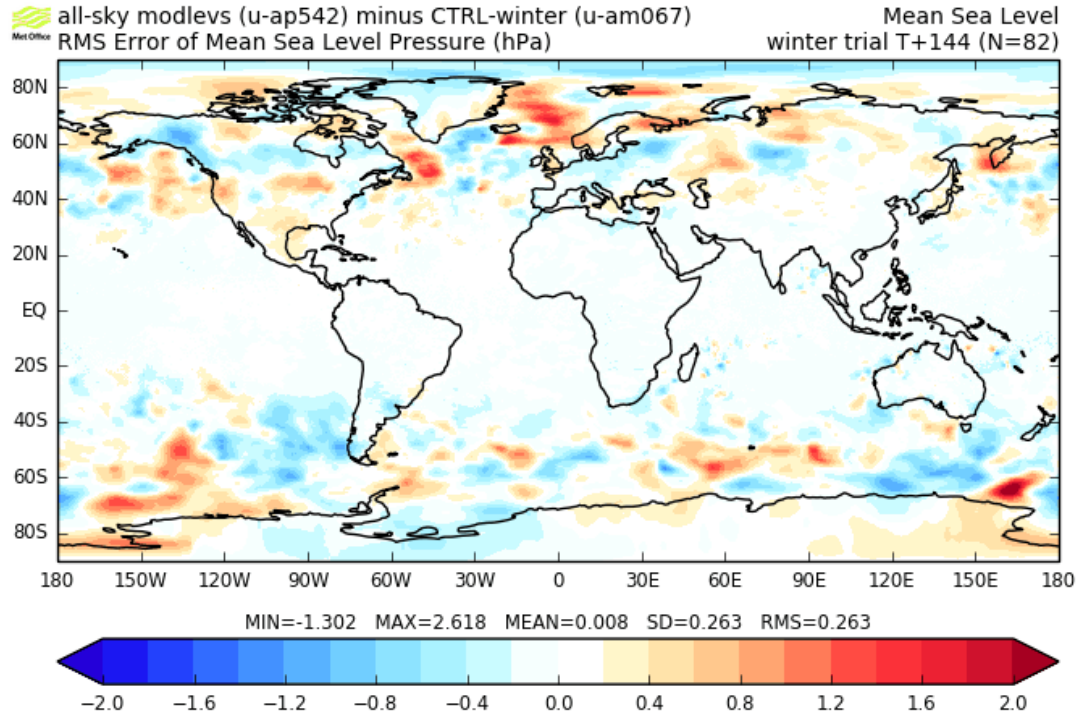
Wind (m/s): Analysis  
Tropics (CRS area 18.75N-18.75S)  
Equalized and Mianred from 25/11/2016 00Z to 20/2/2017 12Z

Cases: → PS40 control (winter) ✕ all-sky models

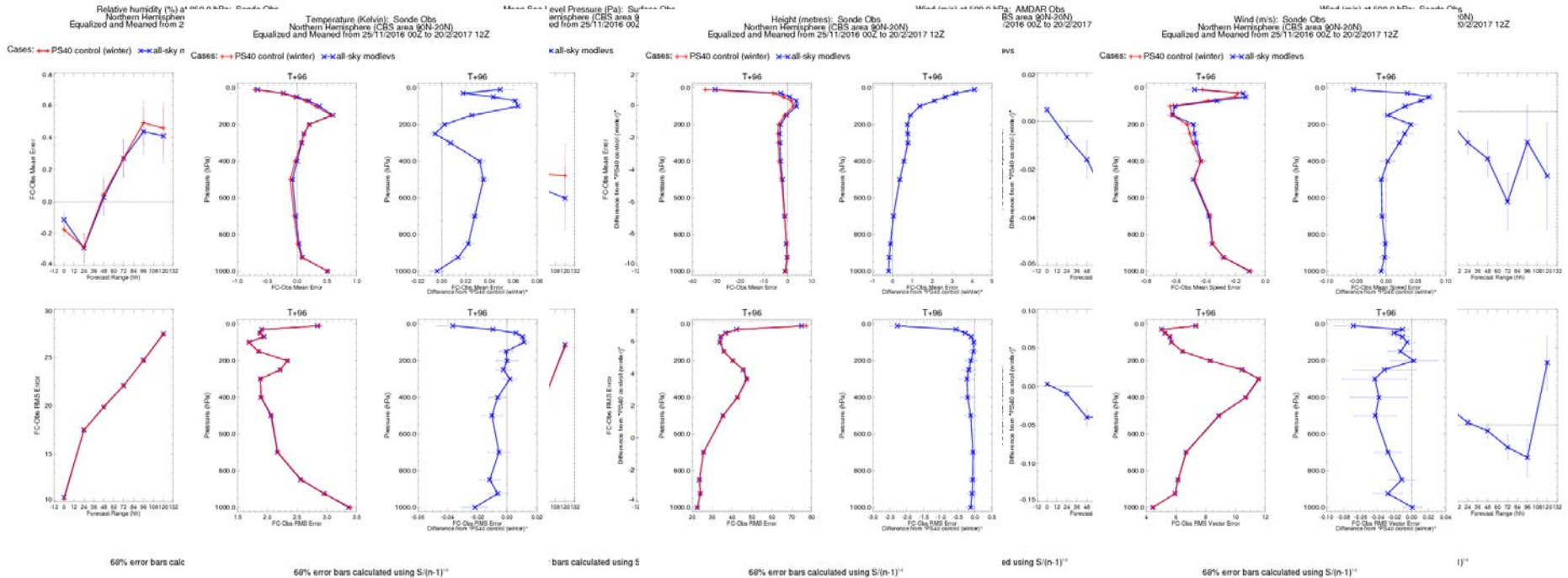


68% error bars calculated using  $S(n-1)^{**}$

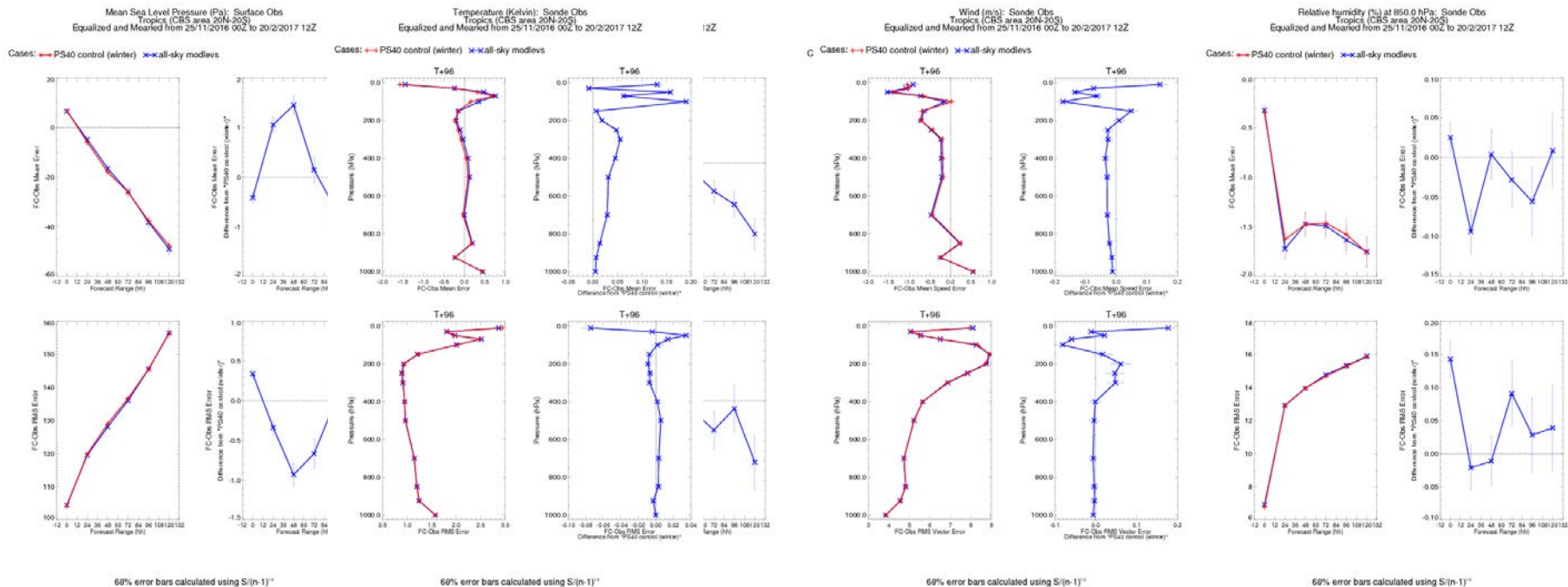
# Verification: MSLP (v own analyses)



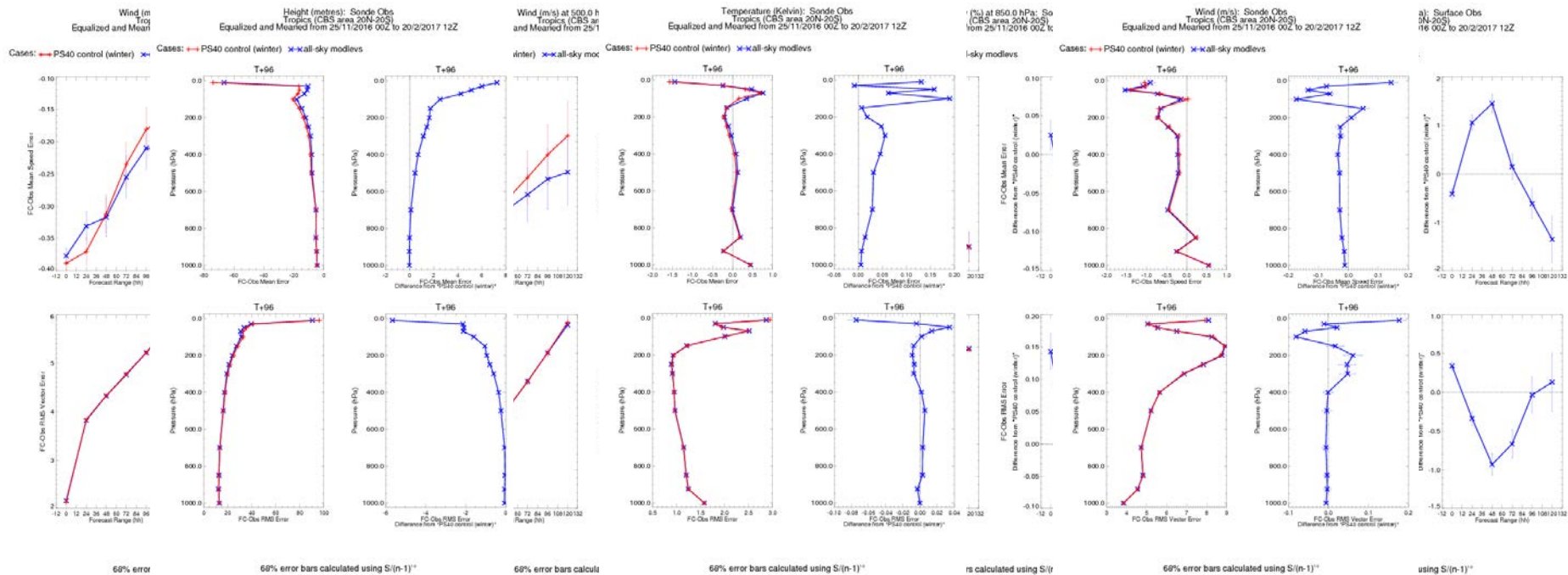
# Verification: in situ (NH)



# Verification: in situ (TR)



# Verification: in situ (SH)



# Conclusions and future work

- A pre-operational system that allows cloud affected radiances from AMSU-A to be assimilated alongside those in clear sky is being developed at the Met Office
- Results from a three-month trial show that the assimilation of non-precipitating radiances from AMSU-A Ch 4 and Ch5 has an overall neutral impact on the control run
- There are, however, consistent RMSE reductions in key indicators (TR T250, TR W850, NH PMSL, NH T2m, NH/SH H500).
- We are also planning to test the assimilation of MHS Ch 4 and Ch 5 in all-sky conditions in the UKV limited area model using hourly 4D-Var cycles, with radiances simulated using RTTOVSCATT.
- On a longer timescale we will consider minimization tests with a succession of linearization states (i.e. the so-called “outer loop”) for all-sky trials.