



Australian Government

Bureau of Meteorology

# Satellite radiance assimilation at the Bureau of Meteorology

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Australian Government

Bureau of Meteorology

# Thank you to our collaborators

Jin Lee,  
Jim Fraser,  
David Howard,  
Leon Majewski,  
Monika Krysta,  
Susan Rennie,  
Andrew Smith,  
Peter Steinle,  
Yi Xiao.

Acknowledgement: Met Office

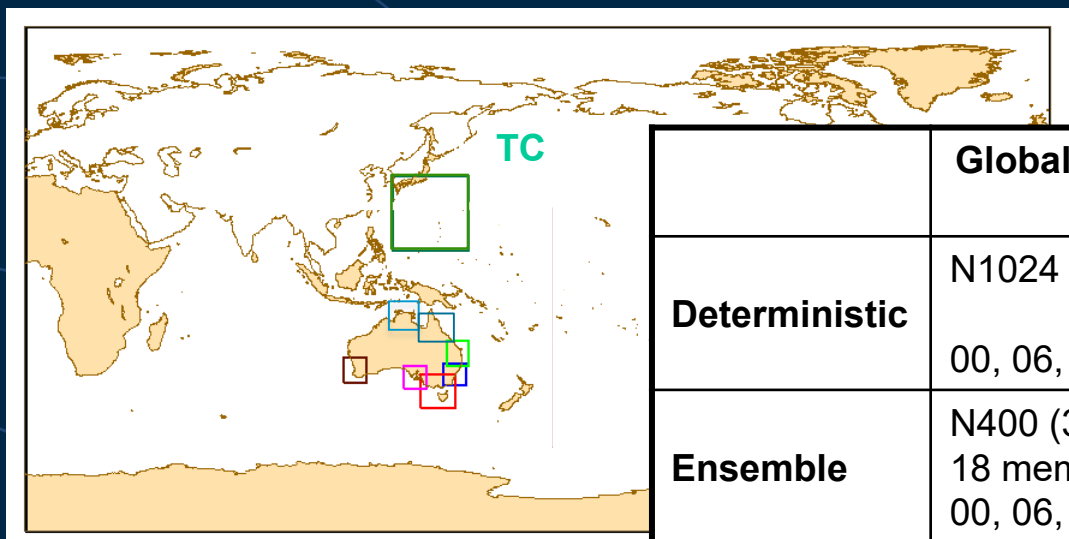


# Overview

- Since the last ITSC,
  - our ACCESS-G global NWP system had a mid-term upgrade which included the addition of new radiance data sources, hourly background files and new background error covariances, delivering a significant increase in forecast skill,
  - our latest ACCESS-C convection-allowing NWP suites (now including hourly 4D-Var assimilation cycles) became operational, and
  - work is now well advanced on the development of a National Analysis System which features multi-pass hourly 4D-Var + 3D-Var assimilation cycles, and includes radiance data assimilation.
- Future work towards the next ACCESS upgrades includes extending our use of radiance data and the addition of new data sources.



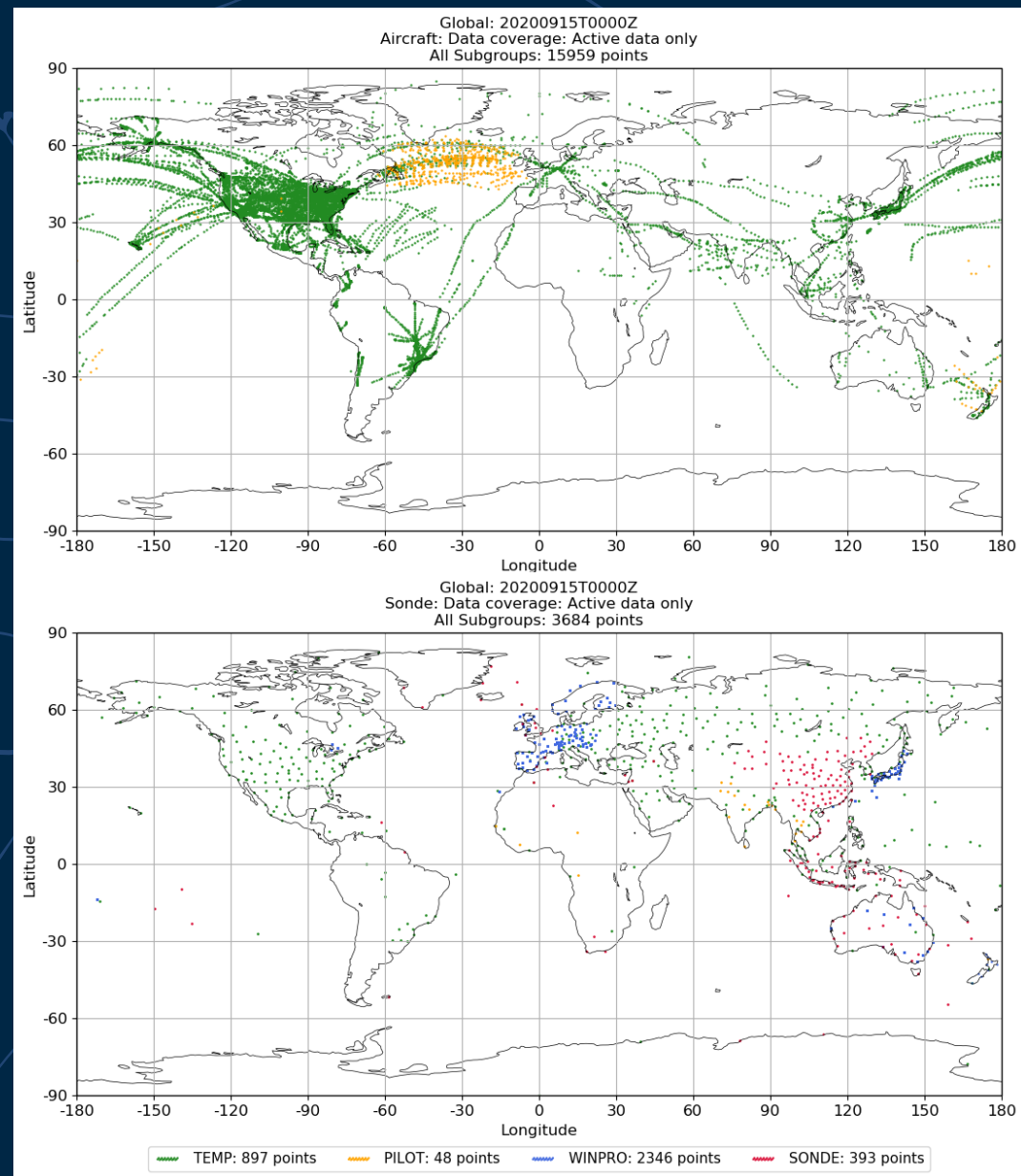
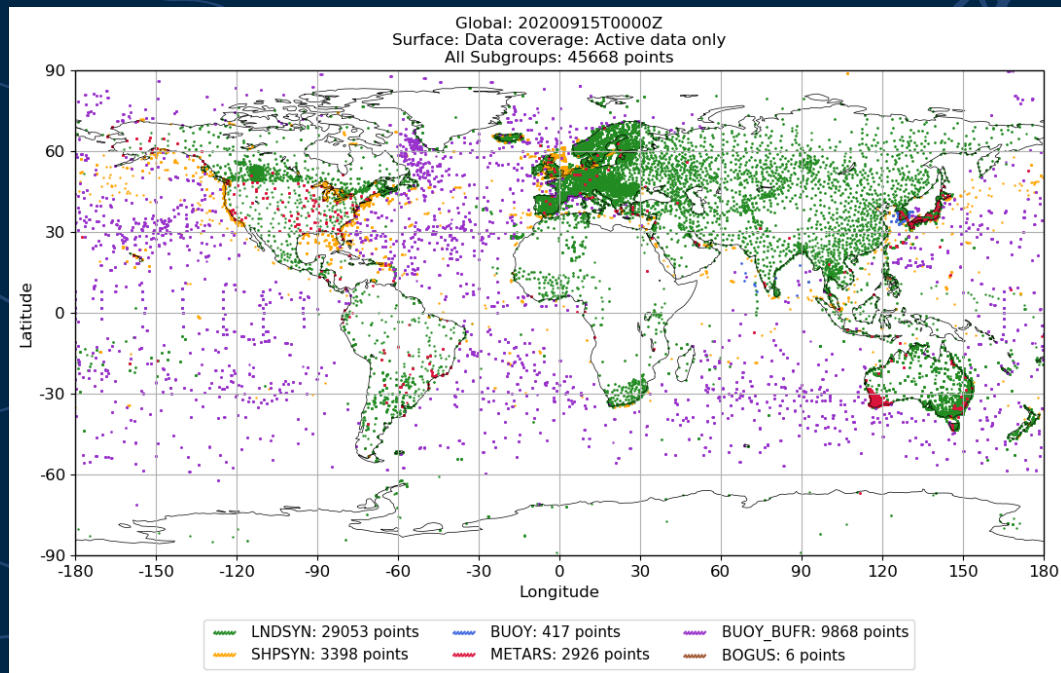
# Summary of ACCESS APS3 systems



|                               | Global (ACCESS-G3 and GE3)  | City (ACCESS-C3 and CE3)  | Tropical Cyclone (ACCESS-TC3)                           |
|-------------------------------|---|---|---|
| <b>Deterministic</b>          | N1024 (12 km), L70<br>00, 06, 12, 18 UTC                              | 1.5 km, L80<br>6 domains<br>Hourly                              | 4 km, L80,<br>Up to 3 relocatable domains<br>00, 12 UTC |
| <b>Ensemble</b>               | N400 (36 km), L70<br>18 members (plus lagging)<br>00, 06, 12, 18 UTC  | 2.2 km, L80<br>12 members (plus lagging)<br>00, 06, 12, 18 UTC* |   |
| <b>Data assimilation</b>      | T-3 :T+3 window<br>Hybrid 4D-Var (N144 + N320)                        | C3: Hourly cycling<br>4D-Var                                    | T-3:T+2 window<br>4D-Var                                |
| <b>Bias Correction</b>        | VarBC, with static scan bias correction                               | Uses VarBC coefficients from G3                                 | Uses VarBC coefficients from G3                         |
| <b>SST analysis</b>           | GAMSSA  | RAMSSA  | GAMSSA  |
| <b>Soil moisture analysis</b> | EKF analysis of screen temperature & humidity and ASCAT soil moisture | Uses Soil moisture analysis from G3                             | Uses Soil moisture analysis from G3                     |



# Observations coverage: Aircraft, Surface and Sonde



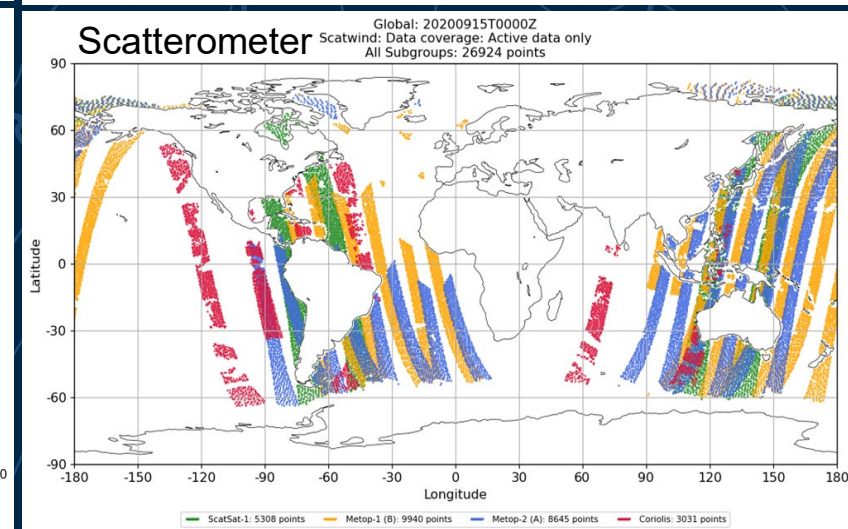
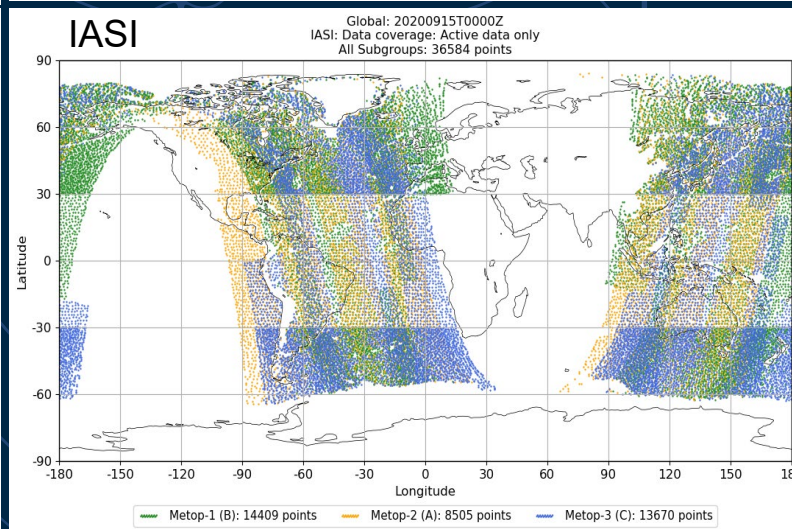
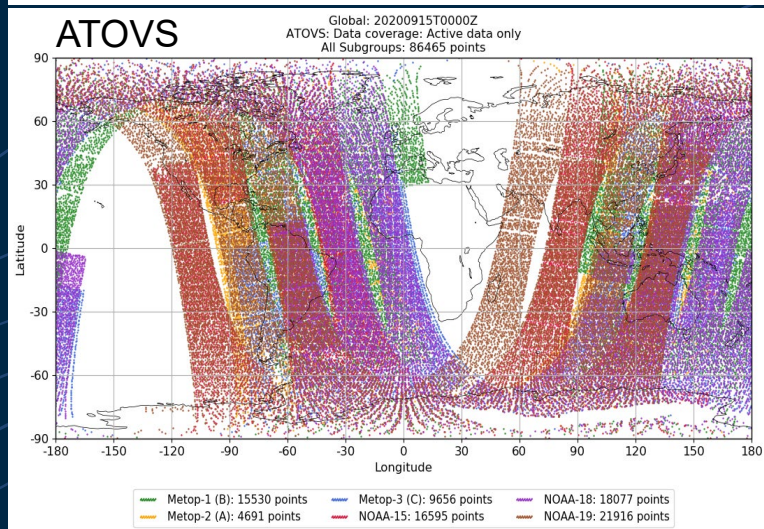
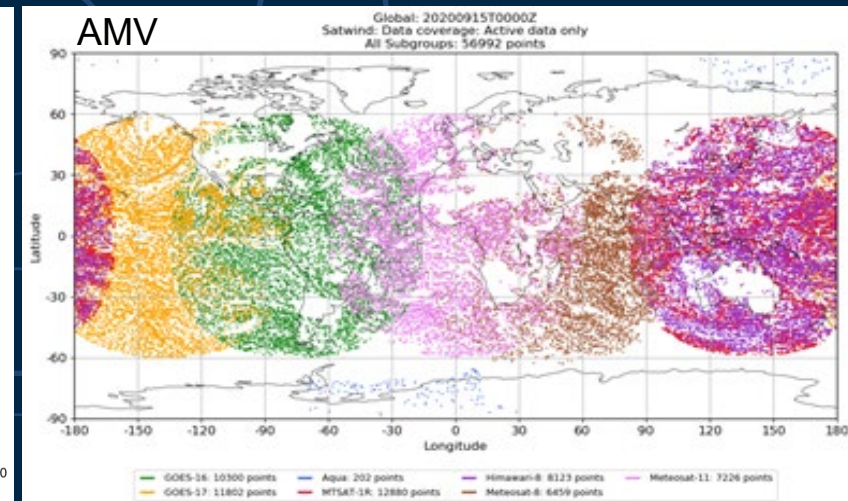
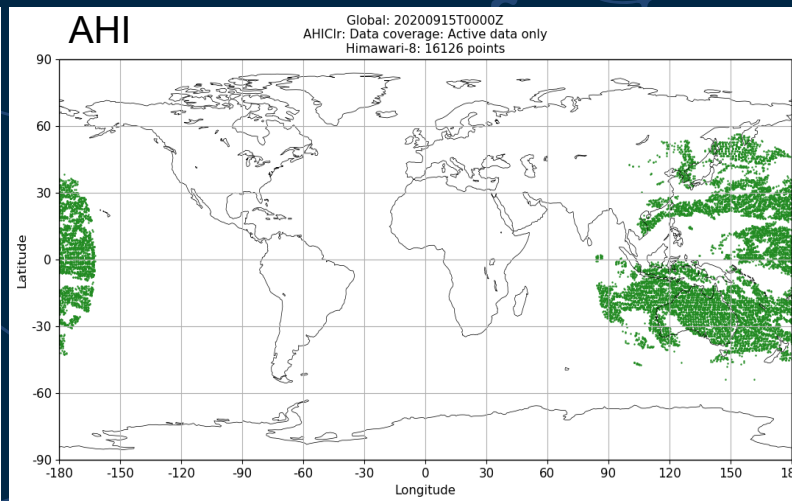
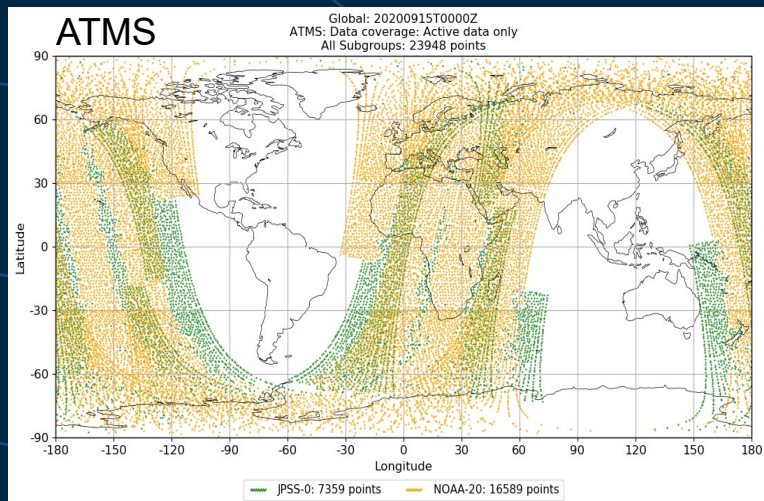




# Observations coverage: Satellite observations

## Radiances

## Winds





# Impact of observations in ACCESS-G

## Total Forecast Sensitivity to Observations Impacts (FSOI) in ACCESS-G2 January – June 2019

Reduction in 24 hour forecast error measured by global moist energy norm.

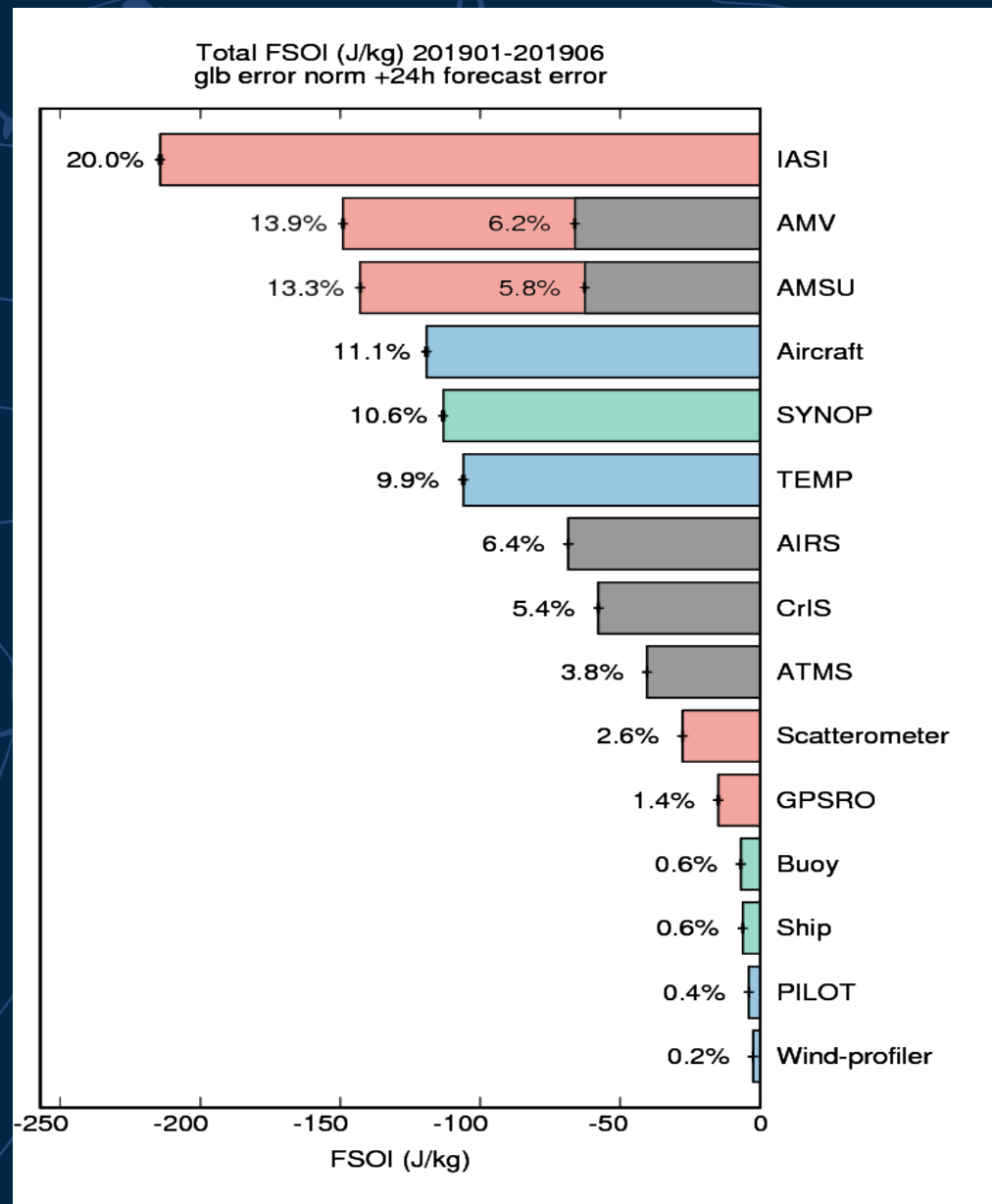
Red: space-based observations

Blue: upper air network

Green: surface observations



( contributions from NOAA/NASA satellite platforms )







# Recent changes in observation usage – ACCESS-G3

|                                | <b>ACCESS-G2</b>   | <b>ACCESS-G3<br/>(from July 2019)</b>   | <b>ACCESS-G3.1<br/>( from June 2020)</b>   |
|--------------------------------|--|---|--|
| Hyperspectral IR sounder (LEO) | AIRS<br>CrIS – S-NPP<br>IASI – Metop-A, Metop-B                                    | AIRS<br>CrIS – S-NPP<br>IASI – Metop-A, Metop-B   | AIRS<br>CrIS – S-NPP, <b>NOAA-20</b><br>IASI – Metop-A, Metop-B, <b>Metop-C</b>                            |
| IR sounder (GEO)               |  | <b>Himawari AHI CSR</b>   | Himawari AHI CSR   |
| Microwave sounders (LEO)       | ATMS – S-NPP<br>ATOVS – N18, N19, Metop-A, Metop-B                                 | <b>AMSR-2</b><br>ATMS – S-NPP<br>ATOVS – <b>N15</b> , N18, N19, Metop-A, Metop-B<br>SSMIS | AMSR-2<br>ATMS – S-NPP, <b>NOAA-20</b><br>ATOVS – N15, N18, N19, Metop-A, Metop-B, <b>Metop-C</b><br>SSMIS |
| GNSS measurements              | GPSRO – <b>COSMIC</b> , TerraSar-X, TanDem-X, Metop-A, B                           | GPSRO – TerraSar-X, TanDem-X, Metop-A, Metop-B, FY-3C<br><b>GPS WV</b>                    | GPSRO – TerraSar-X, TanDem-X, Metop-A, Metop-B, <b>Metop-C</b> , FY-3C, GPS WV                             |
| AMV (mostly GEO)               | Himawari,<br>GOES-16, <b>GOES-15</b> ,<br>Meteosat-8, Meteosat-11,<br>MODIS (Aqua) | Himawari,<br>GOES-16, <b>GOES-15</b> ,<br>Meteosat-8, Meteosat-11,<br>MODIS (Aqua)        | Himawari,<br>GOES-16, <b>GOES-17</b> ,<br>Meteosat-8, Meteosat-11,<br>MODIS (Aqua)                         |
| Scatterometer                  | ASCAT – Metop-A, B,<br><b>Windsat</b>  | ASCAT – Metop-A, B,<br><b>Windsat</b>   | ASCAT – Metop-A, B,<br><b>ScatSat-1</b>  |





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# G3.1 trial Scorecard

## Australia

Anomaly  
Correlation and  
S1 Skill Score  
on left

Bias and RMSE  
on right

Statistically  
significant  
values in colour:

+ve Blue

-ve Red

### Australia ⓘ

| Parameter               | Level (hPa) | 24     | 48     | 72     | 96     | 120    | 144    | 168    |
|-------------------------|-------------|--------|--------|--------|--------|--------|--------|--------|
| Geopotential Height     | 100         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
| Mean Sea-Level Pressure | 0           | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
| Temperature             | 100         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
| Wind U-Component        | 100         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
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|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |

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|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
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|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
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|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
| Wind V-Component        | 100         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |



# G3.1 trial Scorecard

## Tropics

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|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
| Mean Sea-Level Pressure | 0           | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
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|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
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|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
| Wind V-Component        | 100         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 250         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 500         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |
|                         | 850         | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S | A<br>S |

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|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
| Mean Sea-Level Pressure | 0           | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
| Temperature             | 100         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
| Wind U-Component        | 100         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
| Wind V-Component        | 100         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 250         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 500         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |
|                         | 850         | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R | B<br>R |



# Tropics – change in RMSE for G3.1 vs G3

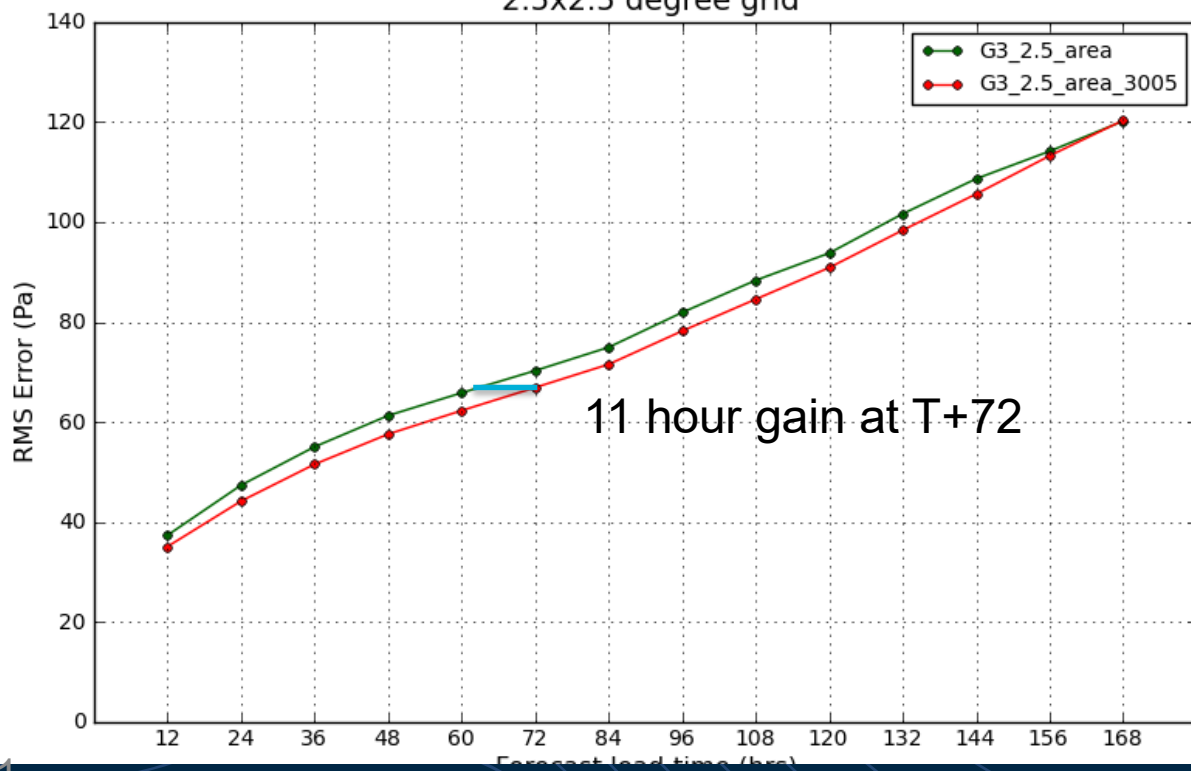
PMSL

G3

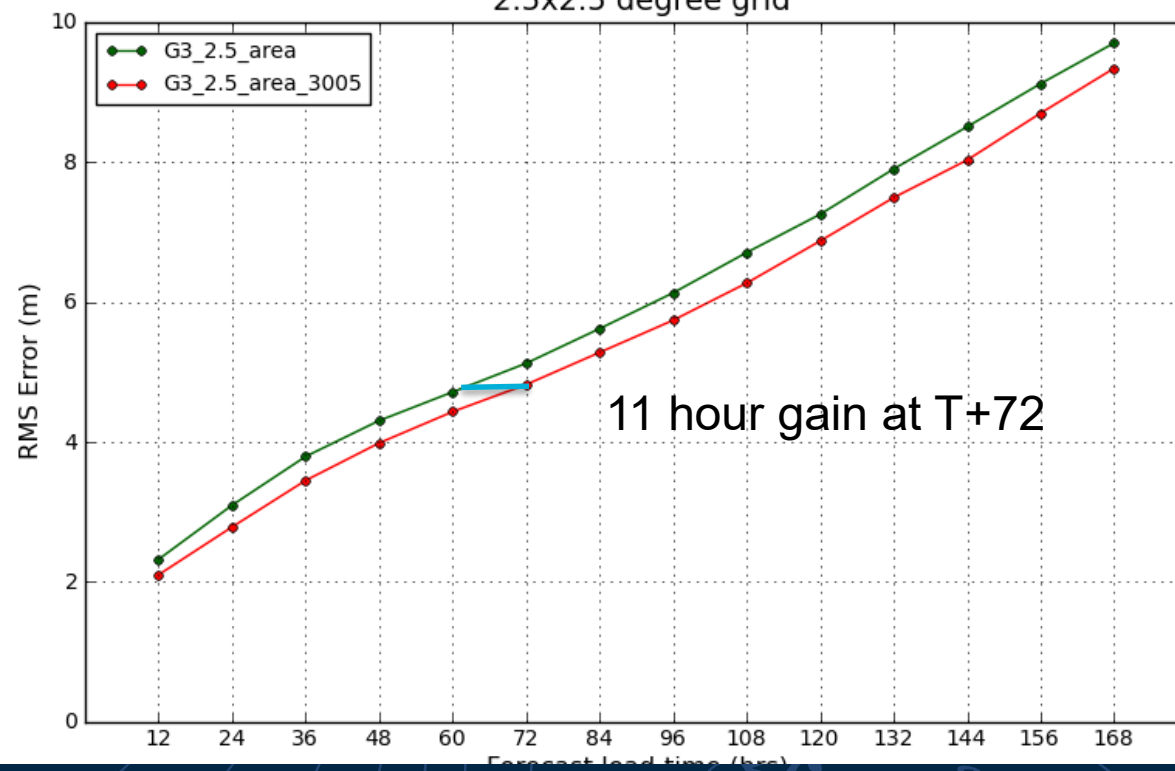
G3.1

Z500

Forecast Lead time  
msl0hpa  
Tropics  
20200401 00UTC to 20200606 12UTC  
2.5x2.5 degree grid



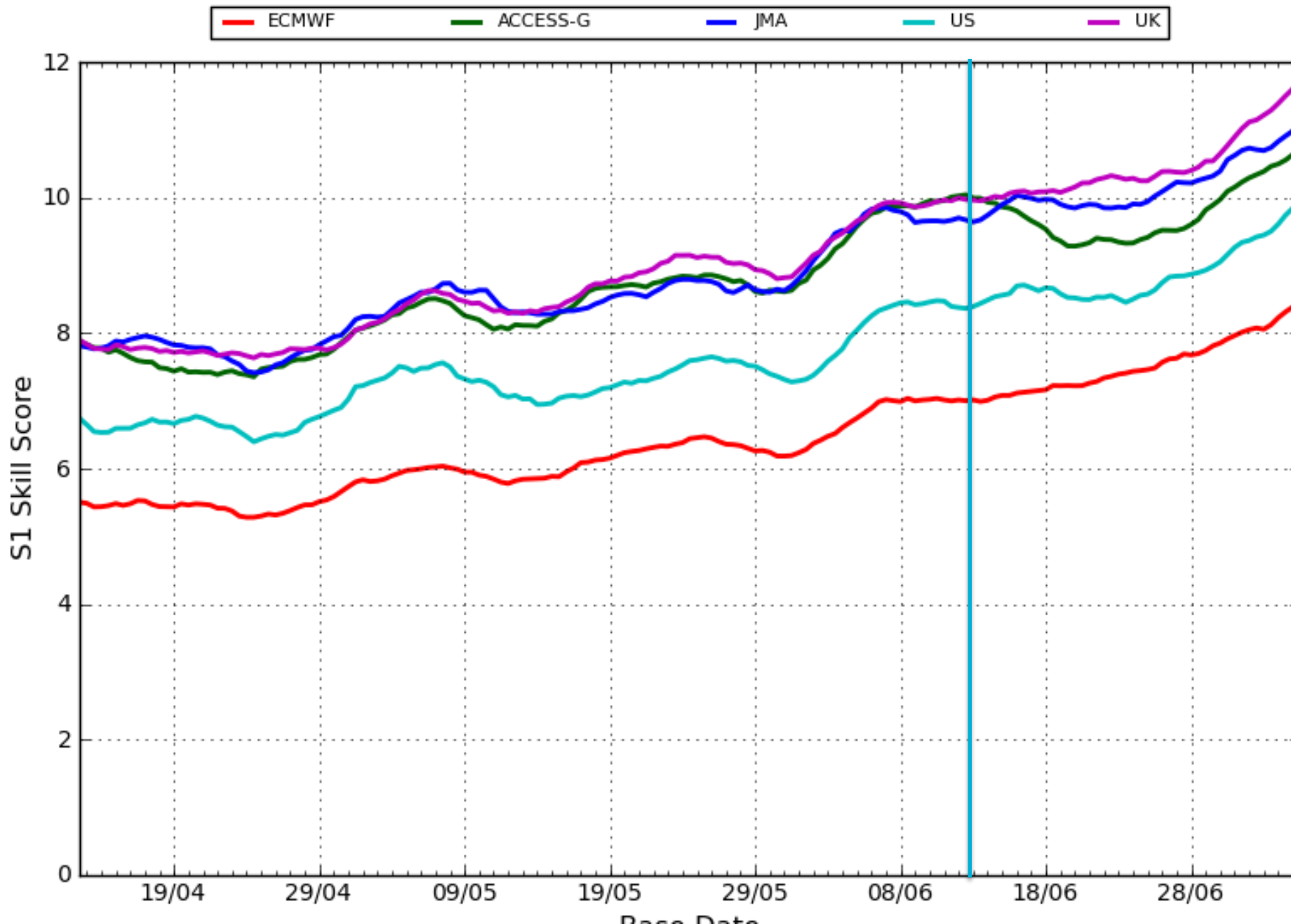
Forecast Lead time  
gh500hpa  
Tropics  
20200401 00UTC to 20200606 12UTC  
2.5x2.5 degree grid





+24h S1 skill score  
500 hPa geopotential hgt  
for Northern Hemisphere,  
pre/post ACCESS-G3.1  
upgrade (vertical line).

# gh500hpa Northern Annulus 24hr forecast - 20200409 00UTC to 20200708 12UTC







# Observation usage across all models (satellites in red)

|                                | <b>Global<br/>(ACCESS-G3)</b>                                | <b>City<br/>(ACCESS-C3)</b>                                  | <b>Tropical Cyclone<br/>(ACCESS-TC3)</b>                     |
|--------------------------------|--|--|--|
| Hyperspectral IR sounder (LEO) | AIRS, CrIS, IASI   | AIRS, CrIS, IASI   | AIRS, CrIS, IASI   |
| IR sounder (GEO)               | Himawari AHI CSR   |  |  |
| Microwave sounders (LEO)       | AMSR-2, ATMS, ATOVS, SSMIS                                   | ATMS, ATOVS  | ATMS, ATOVS  |
| GNSS measurements              | GPSRO, GPS WV  | GPS WV   | GPS WV (if in domain)  |
| AMV (mostly GEO)               | Himawari, GOES-16, GOES-17, Meteosat-8, Meteosat-11, MODIS   | Himawari   | Himawari (Meteosat-8, GOES-17 if in domain)                  |
| Scatterometer                  | ASCAT, ScatSat-1   | ASCAT  | ASCAT, ScatSat-1   |
| Conventional observations      | AIREPS, AMDAR, BUOY, METAR, PILOT, SHIP, SYNOP, TEMP, WINPRO | AIREPS, AMDAR, BUOY, METAR, PILOT, SHIP, SYNOP, TEMP, WINPRO | AIREPS, AMDAR, BUOY, METAR, PILOT, SHIP, SYNOP, TEMP, WINPRO |
| Radar                          |  | Doppler Winds  |  |
| Other                          | TC BOGUS   |  | TC BOGUS   |



# Bureau Direct Reception of LEO sounders for ACCESS-C3

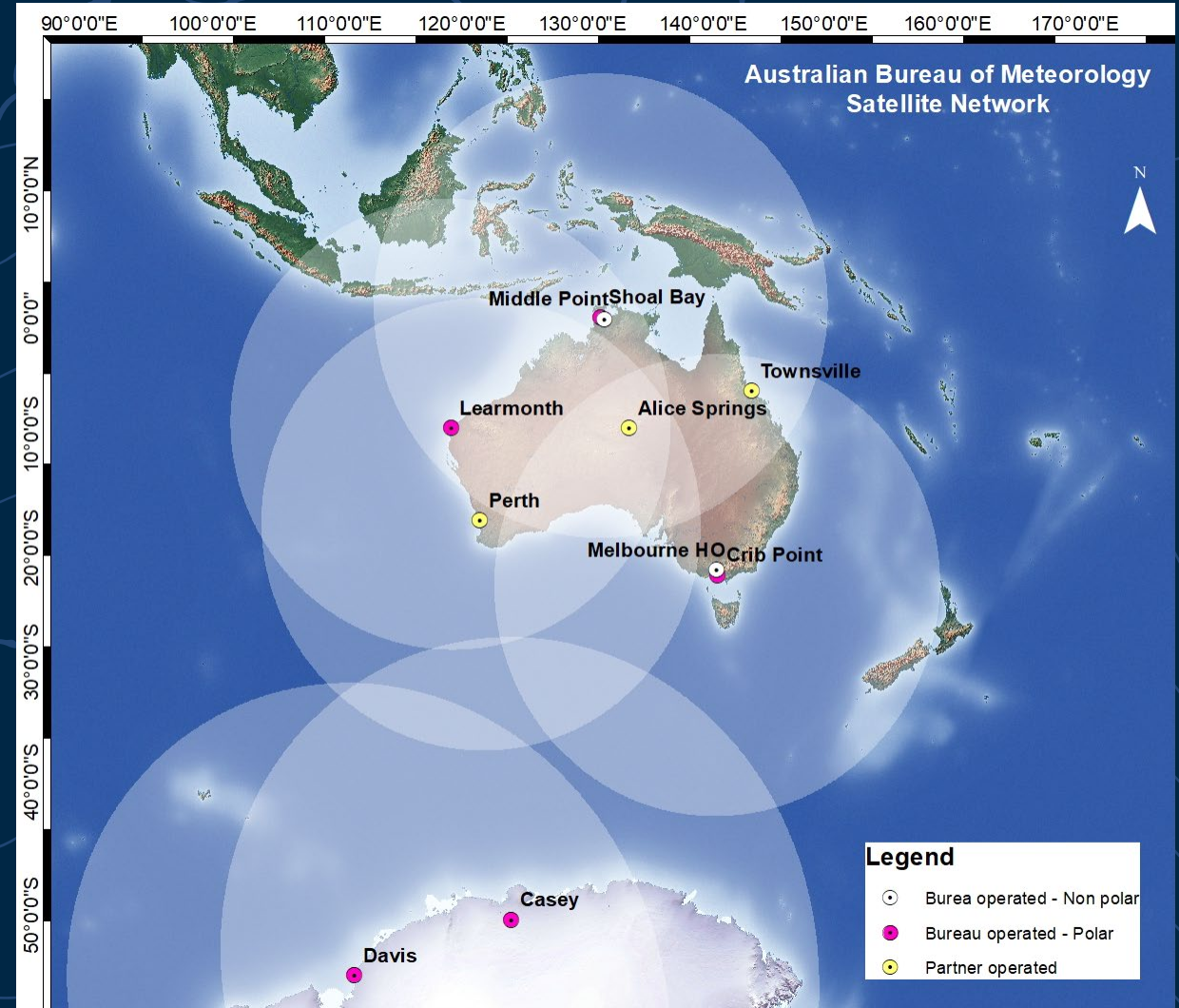
The Bureau operates three mainland receiving stations and two in Antarctica

- Shoal Bay, Learmonth, Crib Point
- Casey, Davis

Three additional reception sites are operated by partner agencies

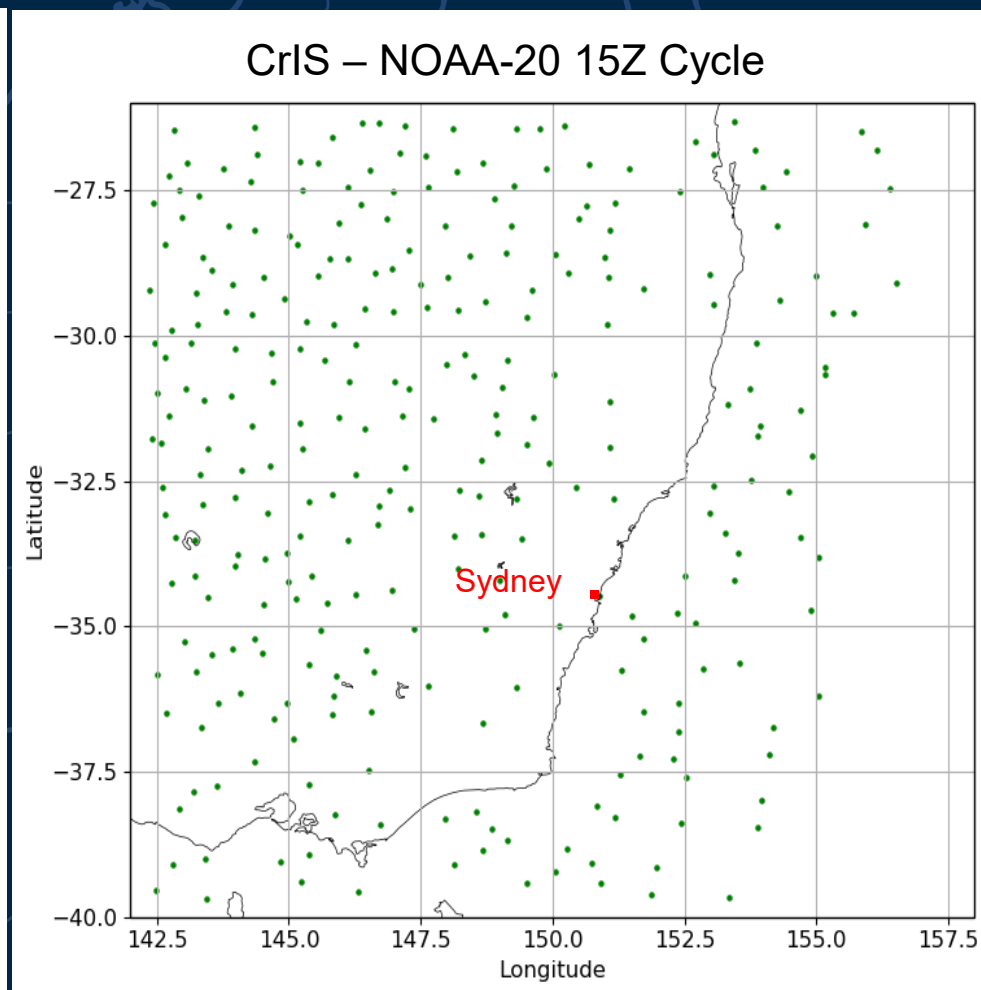
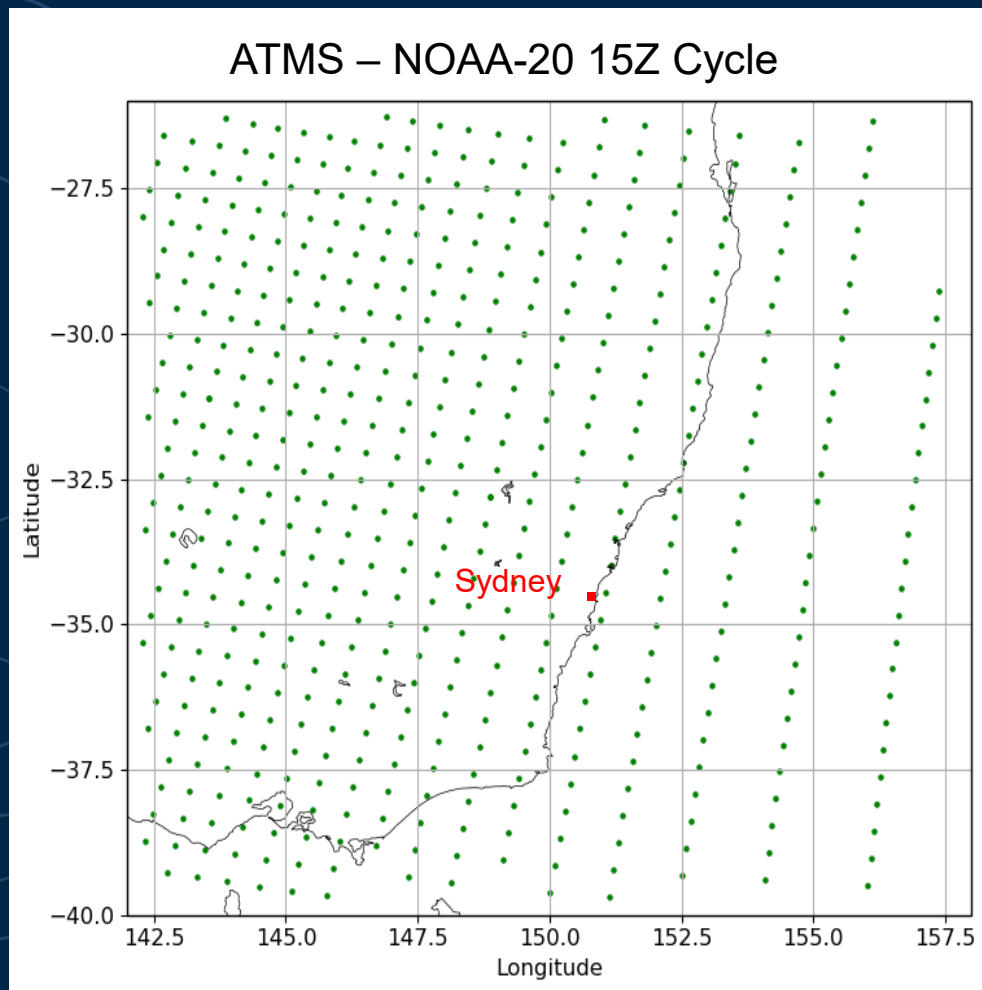
- Perth, Alice Springs, Townsville

Observations from these sites come in much more quickly, allowing us to use sounder data in ACCESS-C3





# S-NPP and NOAA-20 data in C3 Sydney model

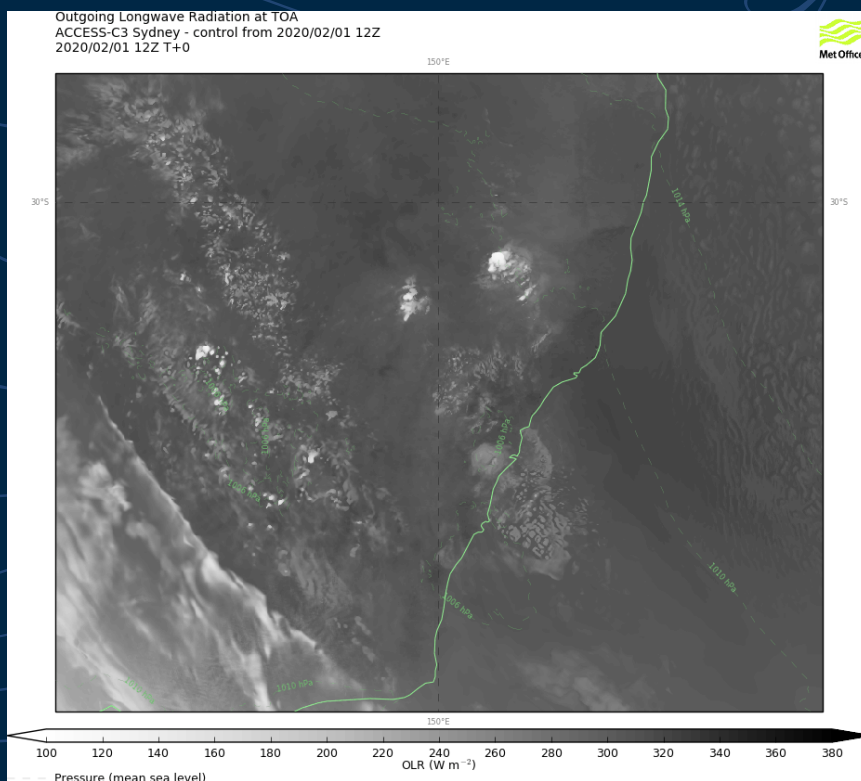




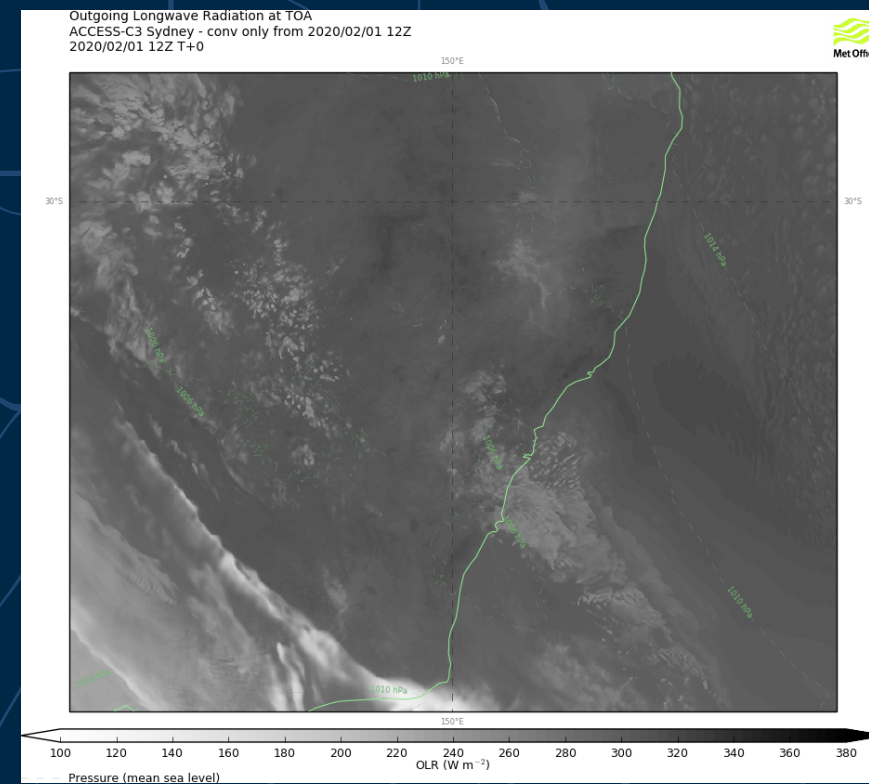
# Impact of satellite observations in ACCESS-C3 (1)

Jin Lee

|             | Observation types assimilated   |
|-------------|---|
| control     | "aircraftsondesurface", "airs", "atovs", "atms", "cris", "dopplerradialwinds", "groundgps", "iasi", "satwind", "scat" |
| denial test | "aircraftsondesurface" only   |



Outgoing LW radiation  
at TOA



All observations

Conventional only

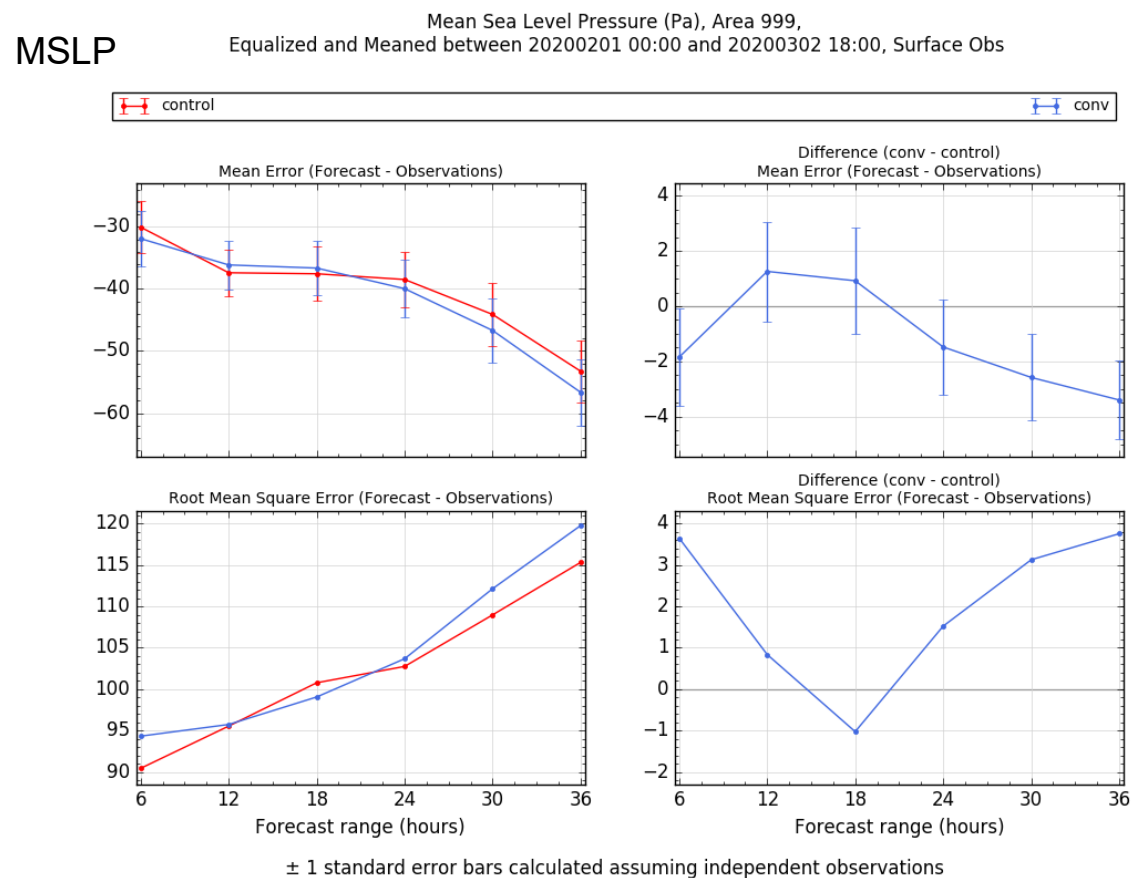




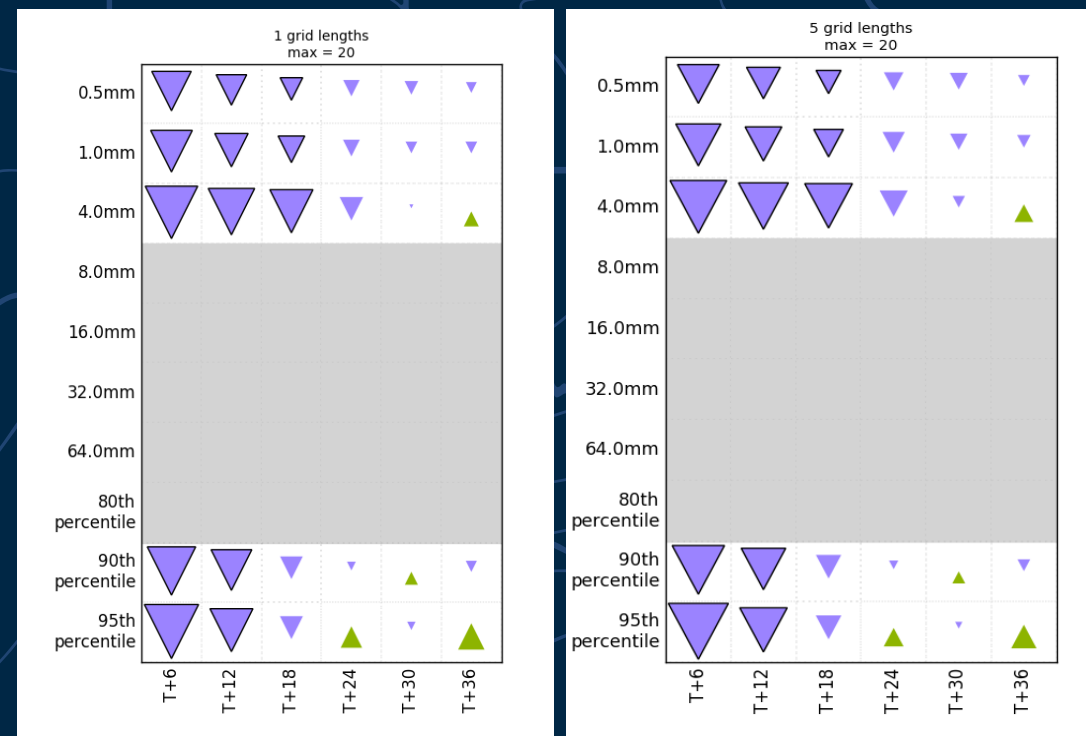
# Impact of satellite observations in ACCESS-C3 (2)

Jin Lee

Conclude: significant positive impact on ACCESS-C3 forecast skill from satellite observations as measured by a number of skill metrics.

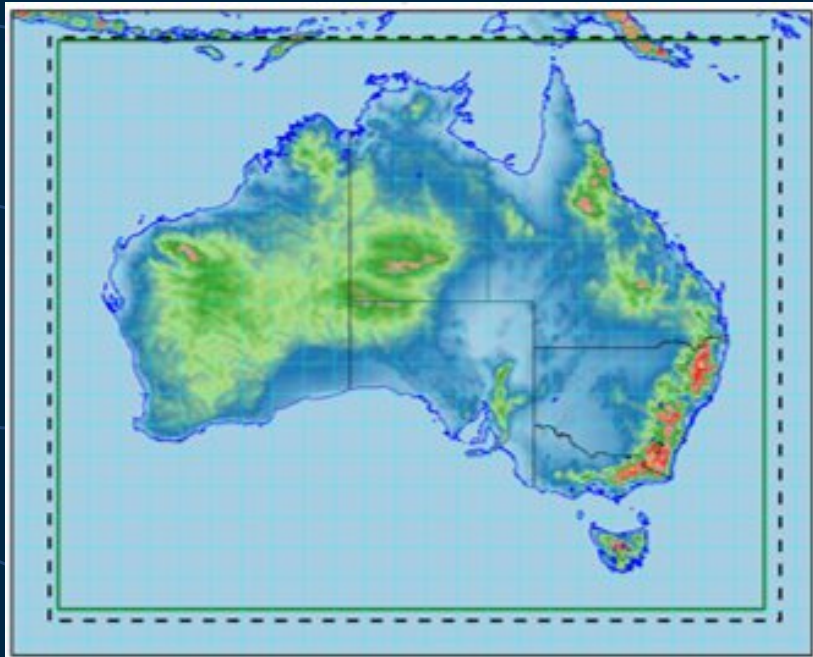


% diff FSS Conv. vs All-obs 6h accum. precip.





# National Analysis System (NAS) – due in 2022



Domain covers Australia

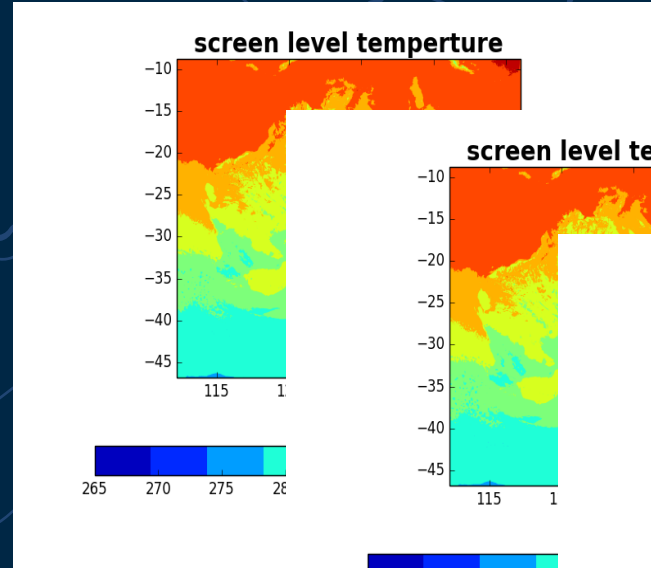
- size 2400 x 1920 x L90
- ~ 2.2 km

Based on ACCESS-C

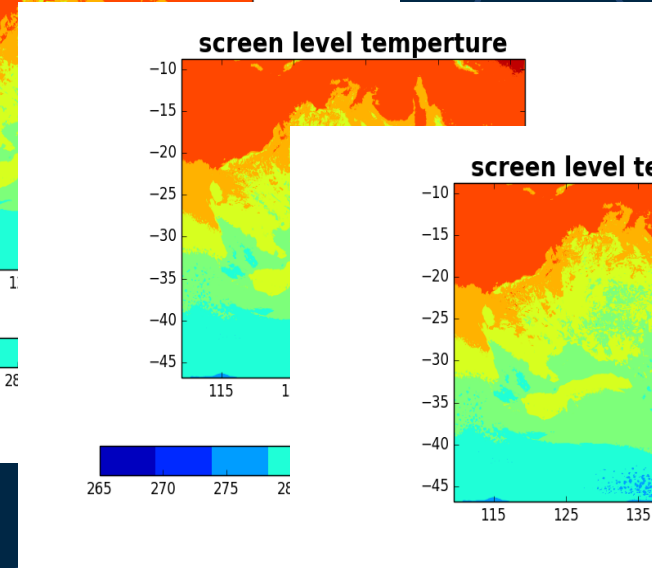
Produces analyses reflecting the current meteorological situation over Australia

Increases forecaster situational awareness

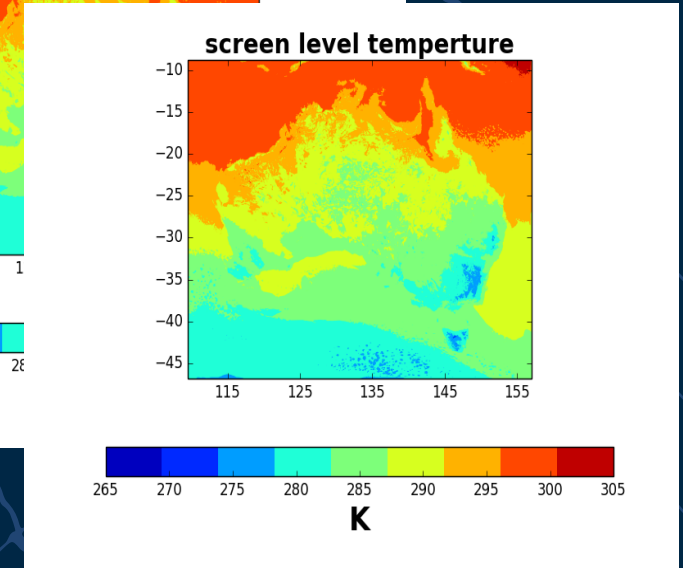
4D-Var



3D-Var



3D-Var\_overfit



- Hourly RUC analyses (3 types)
  - 4D-Var (including satellite radiances)
  - 3D-Var
  - 3D-Var overweighting observations



# Future work

- Addition of many new instruments already in space
  - Extra GEO radiances
  - Radiances from Chinese and Korean satellites
  - (Extra satellite winds: Polar orbiting AMVs, more scatterometers, Aeolus Lidar horizontal line of sight winds
  - Extra GNSS-RO from COSMIC-2 and ground-based GNSS data)
- More use of microwave observations over land, and higher resolution sounder observations in ACCESS-C3
- Addition of Met Office scheme for all-sky microwave data assimilation
- Significant expansion of our capacity to assess observation impacts on forecasts
- Use GEO radiances and GeoCloud retrievals in ACCESS-C3 (W.I.P.)



Australian Government

Bureau of Meteorology

# Thank You

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