

Development of Advanced Data Assimilation Techniques for GOES-16/17 Atmospheric Motion Vectors (AMVs) from in the HWRF

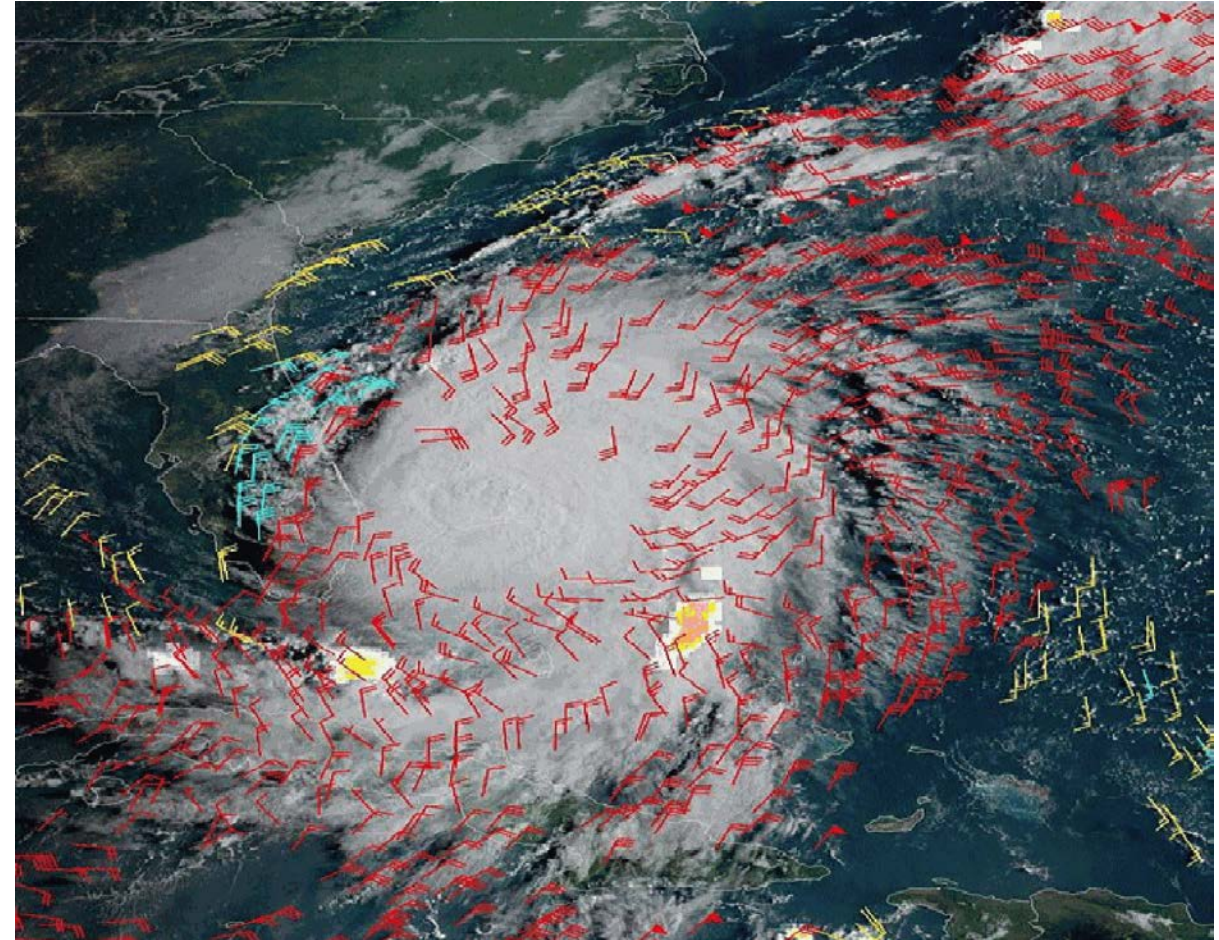
Agnes Lim (CIMSS/SSEC/UW-Madison)

In collaboration with

Jaime Daniels (NOAA/NESDIS)

Li Bi and Avichal Mehra (NOAA/NCEP/EMC/HWRF)

Hurricane Dorian



GOES-16 AMVs and GLM Flash Extent Density



HFIP presentation 18 March 2020

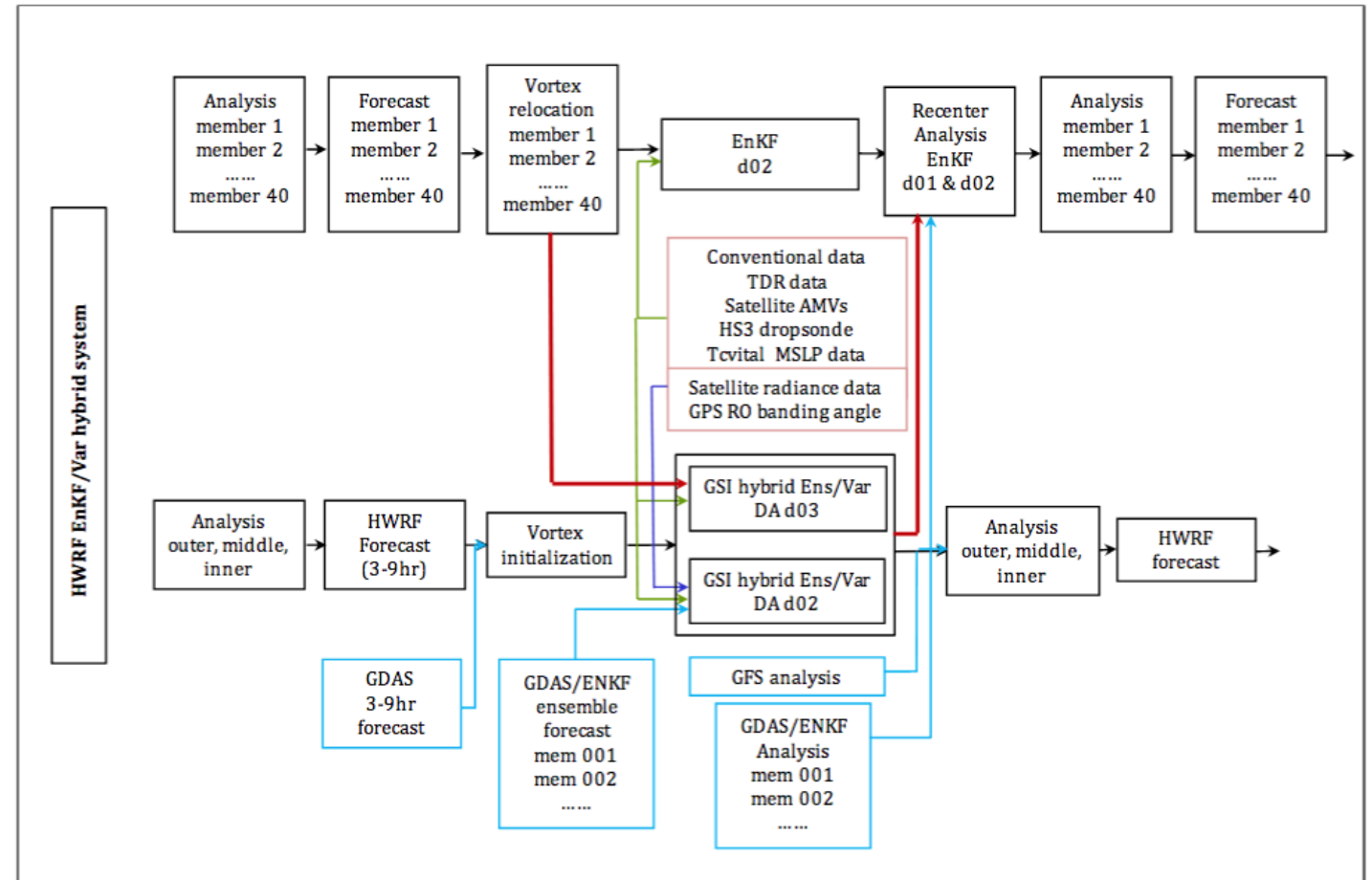


Outline

- HWRF
- GOES-16/17 Winds Product Overview
- Error Profiles and Quality Control Procedures
- Forecast impact on Hurricane Michael and Hurricane Florence
- Summary
- Upcoming plans
- Status on GOES-16 high temporal AMVs and GOES-17 AMVs

HWRF

- HWRF trunk on August 2019
- GSI for HWRF branch in ProdGSI on May 2019
- Self cycled DA hybrid 3DEnVar
- 40 HWRF ensembles for inner core when there is TDR data or priority storm
- 80 GFS ensembles for outer domain.
- Already assimilating infrared (IR), cloud top water vapor(CTWV) and clear air water vapor (CAWV) AMVs.





GOES-16/17 AMV Product Overview

Derived Motion Winds

Specification

Measurement Range Speed: 3-155 m/s; Direction: 0 - 360 degrees

Measurement Accuracy & Precision 7.5 m/s & 4.2 m/s

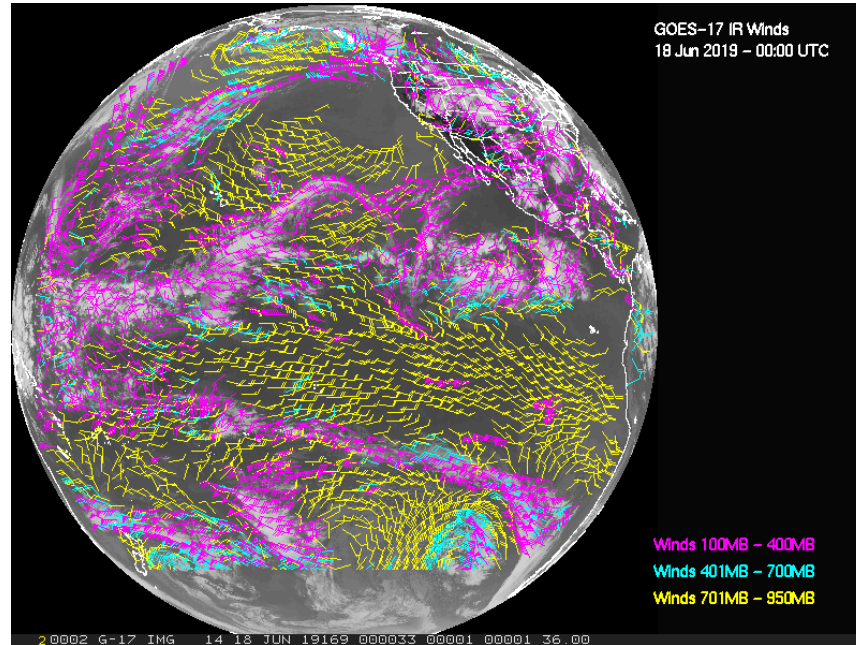
Geographical Coverage and Refresh Rate FD: 60 minutes
 CONUS: 15 minutes
 Mesoscale: 5 minutes

AMV	ABI Band	Central Wavelength (um)	Cloud	Clear-Sky Water Vapor	Spatial Resolution/km
VIS	2	0.64	X		7.5
SWIR	7	3.9	X		30
WV	8	6.2	X	X	
WV	9	6.9		X	
WV	10	7.3		X	38
IR	14	11.2	X		

GOES-17

Band 14 (11um) LWIR AMVs

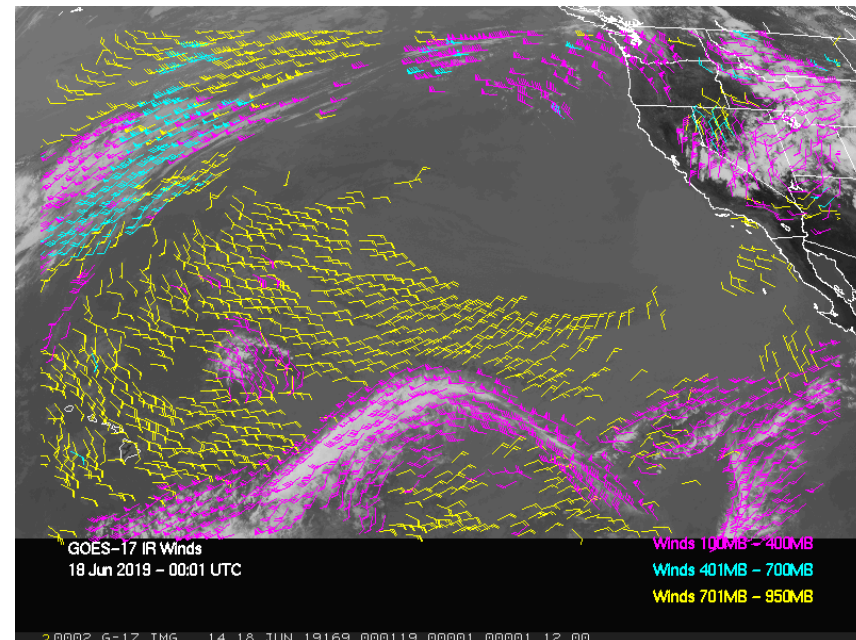
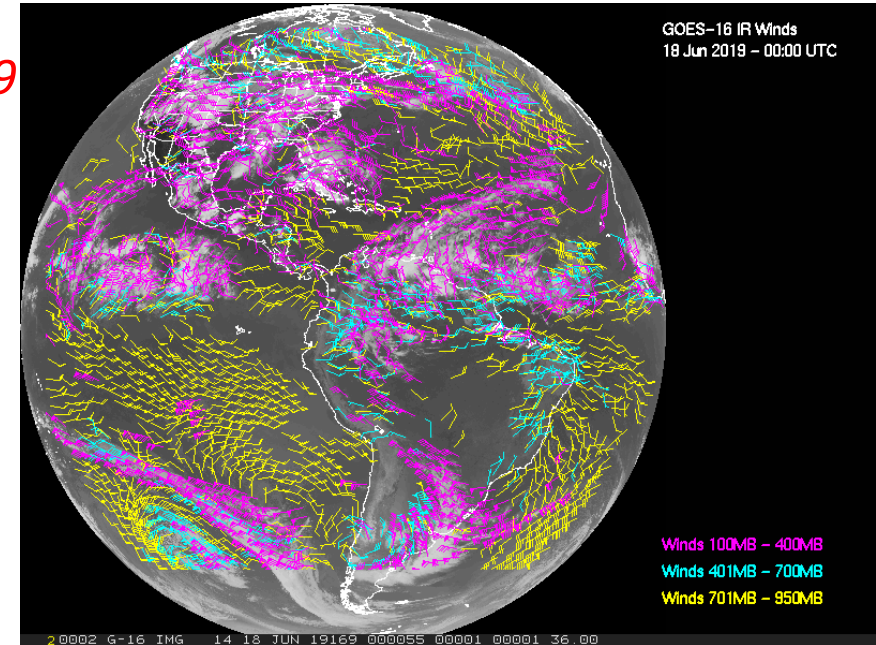
GOES-16



June 18, 2019

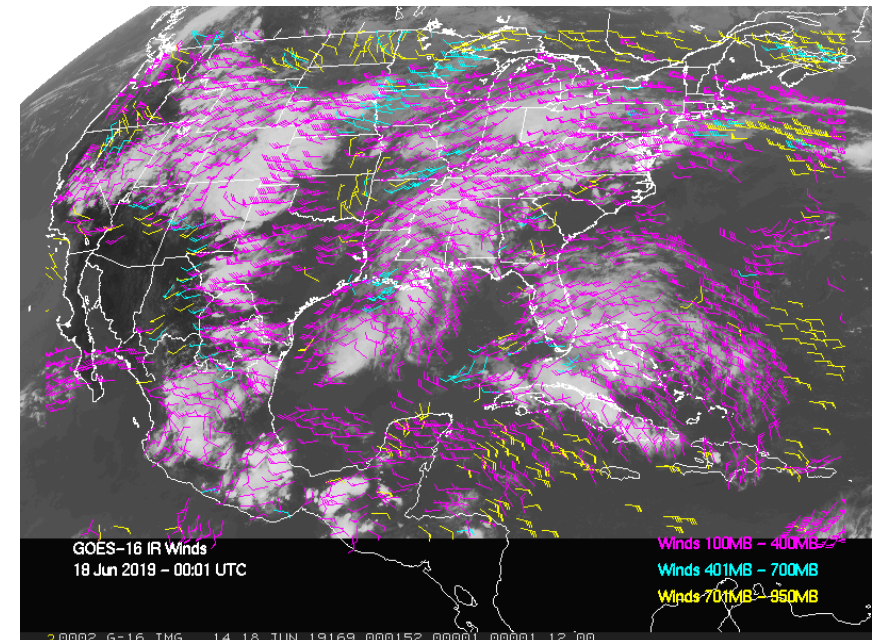
Full Disk
AMV Product
cadence:

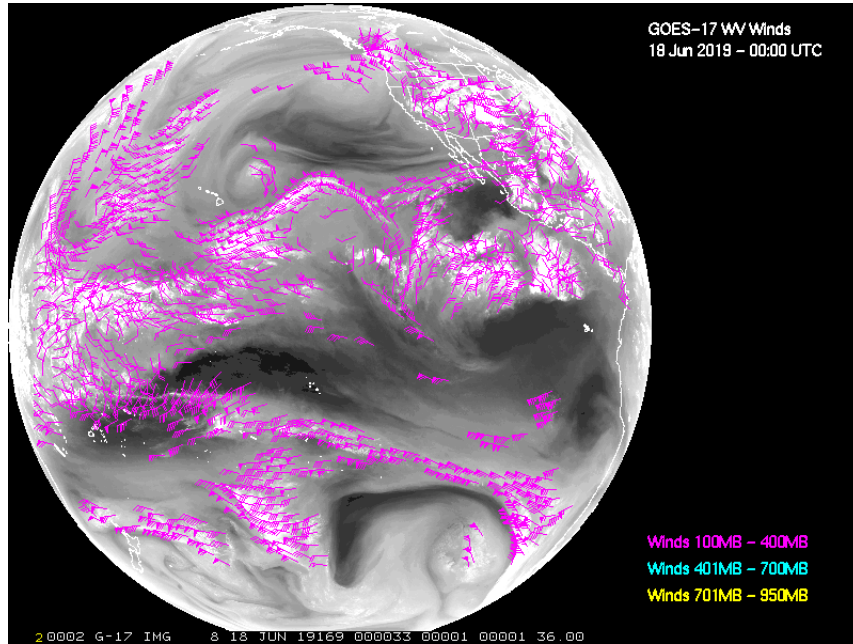
60 mins



CONUS
AMV Product
cadence:

15 mins

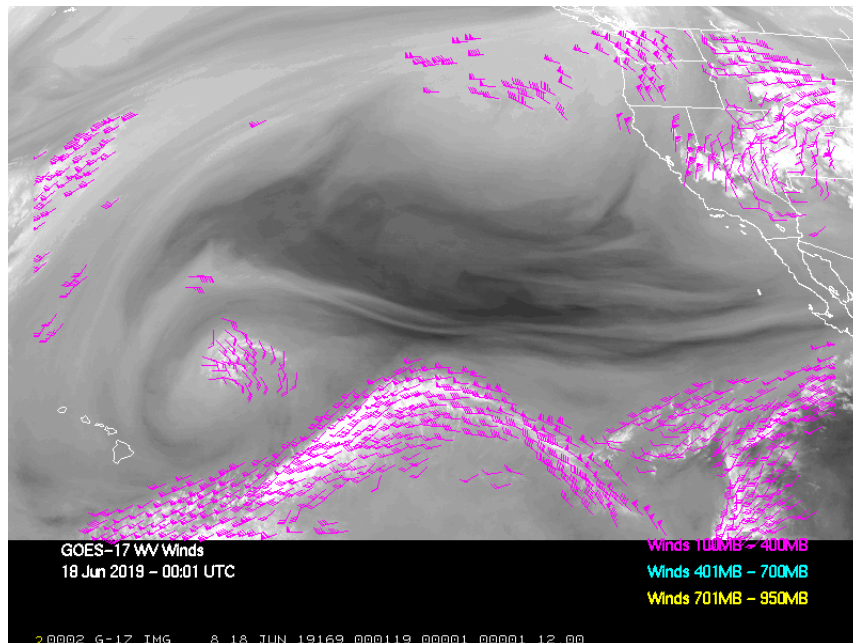
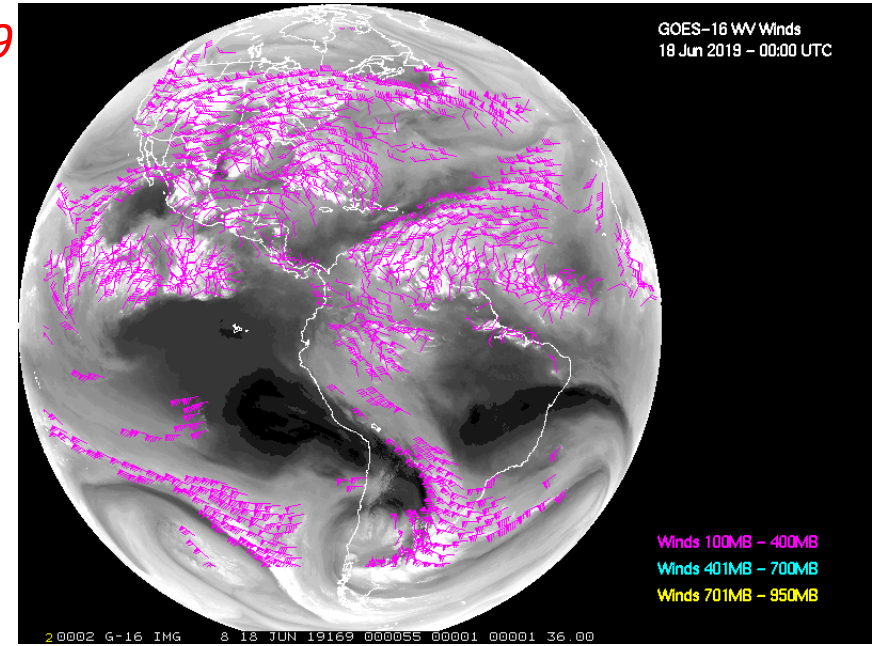




June 18, 2019

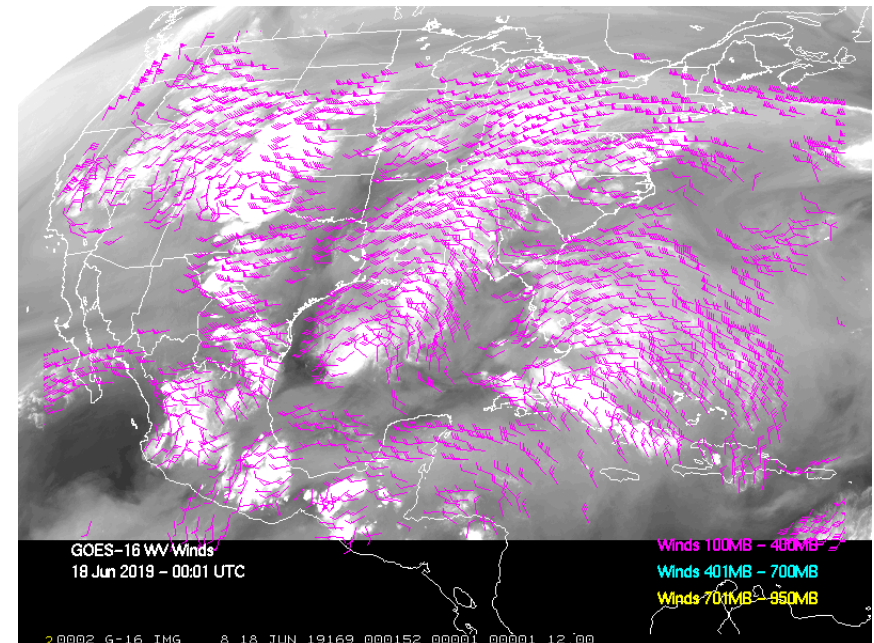
Full Disk
AMV Product
cadence:

60 mins



CONUS
AMV Product
cadence:

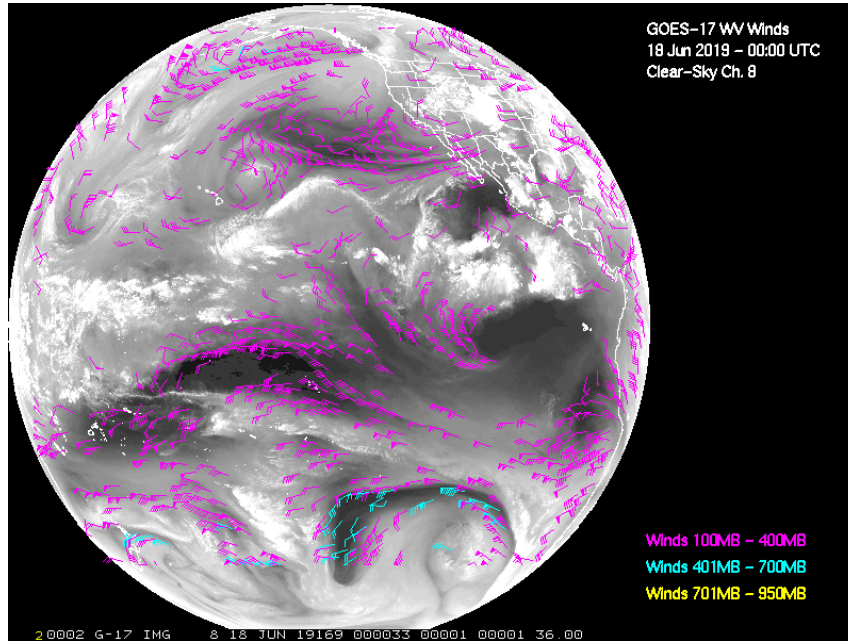
15 mins



GOES-17

Band 8 (6.2um) Clear-sky WV AMVs

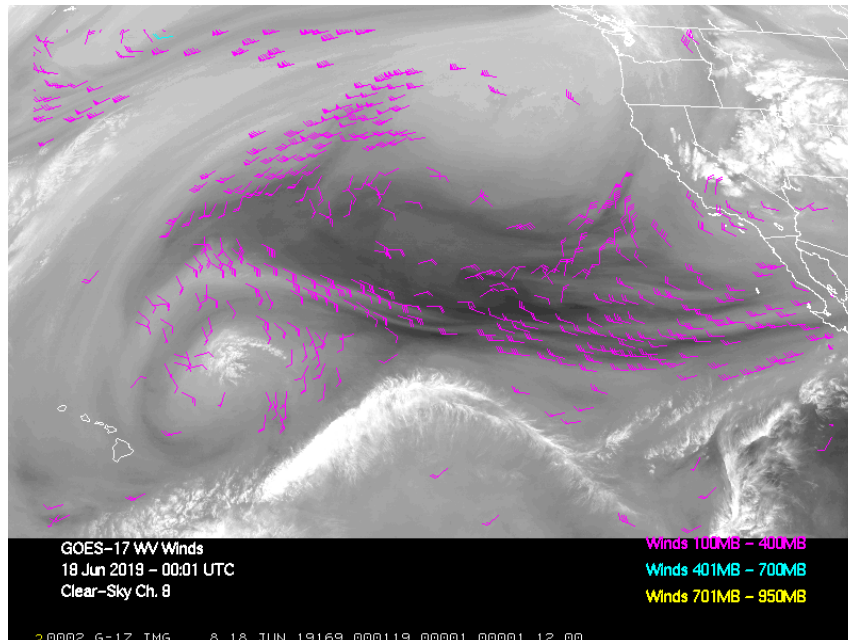
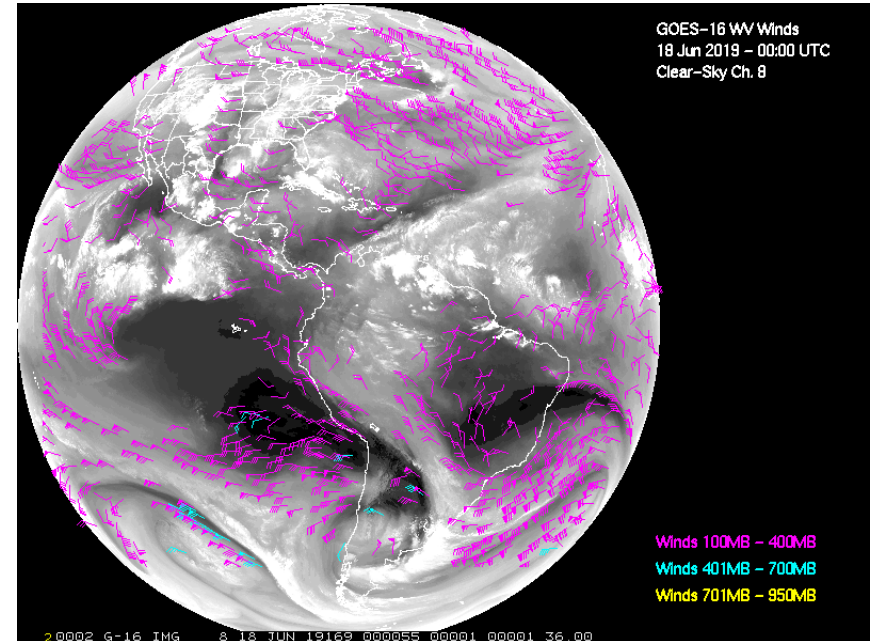
GOES-16



June 18, 2019

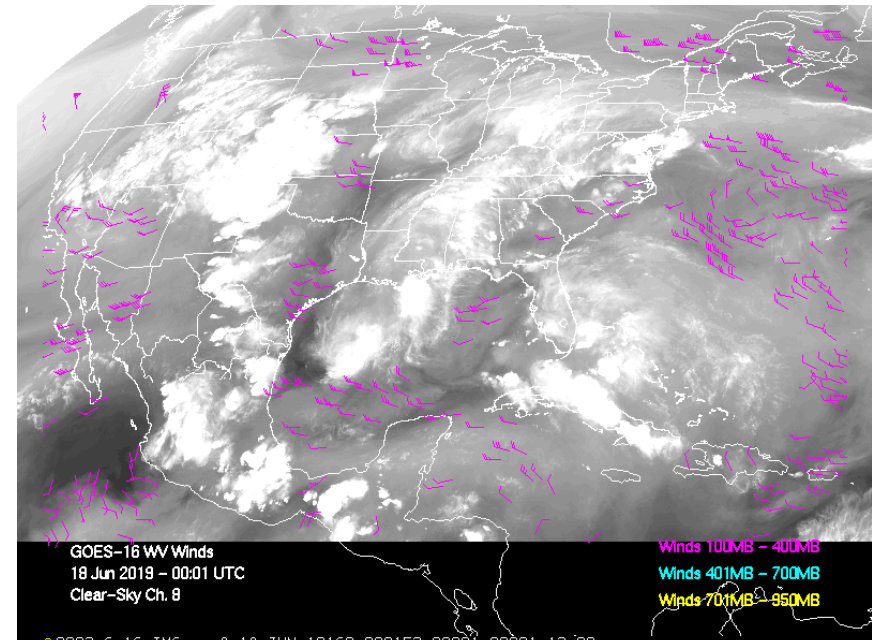
Full Disk
AMV Product
cadence:

60 mins



CONUS
AMV Product
cadence:

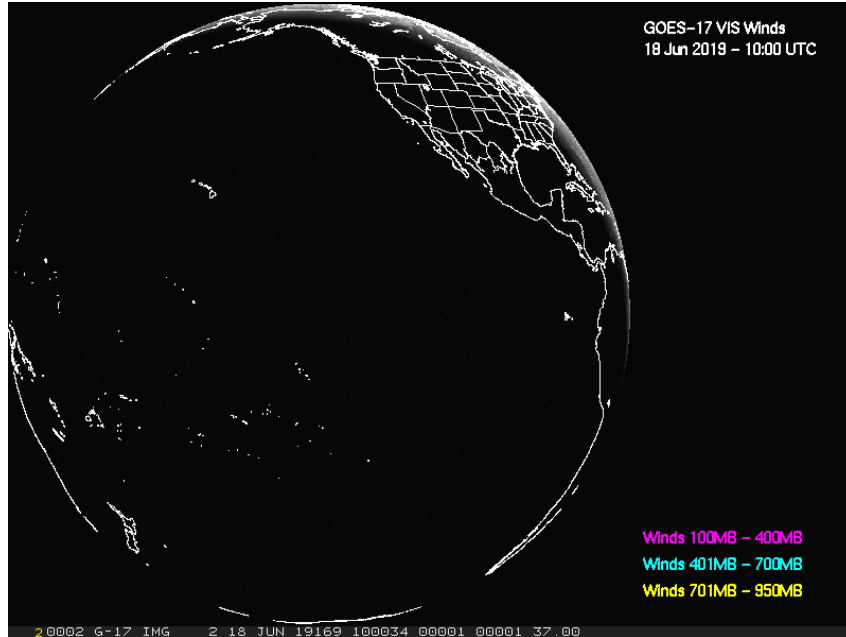
15 mins



GOES-17

Band 2 VIS AMVs

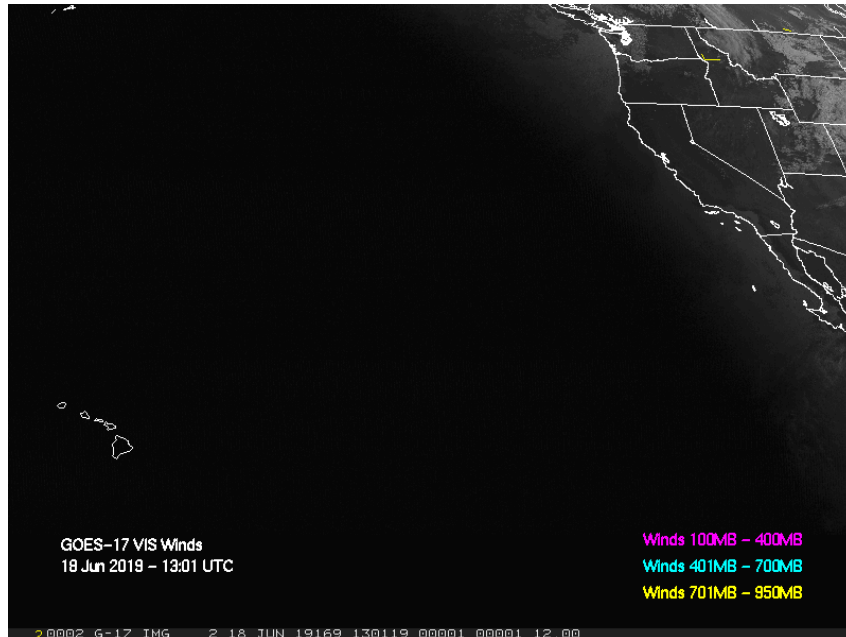
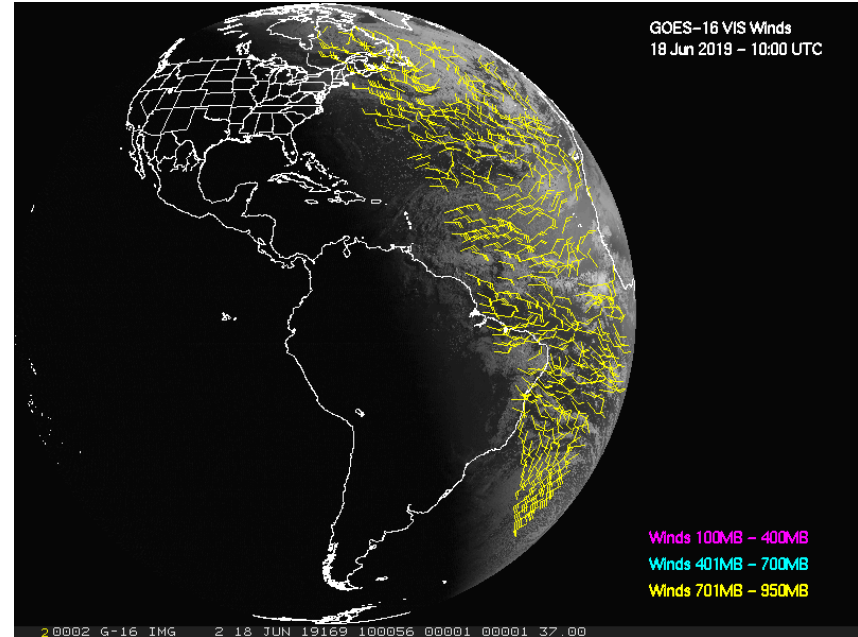
GOES-16



June 18, 2019

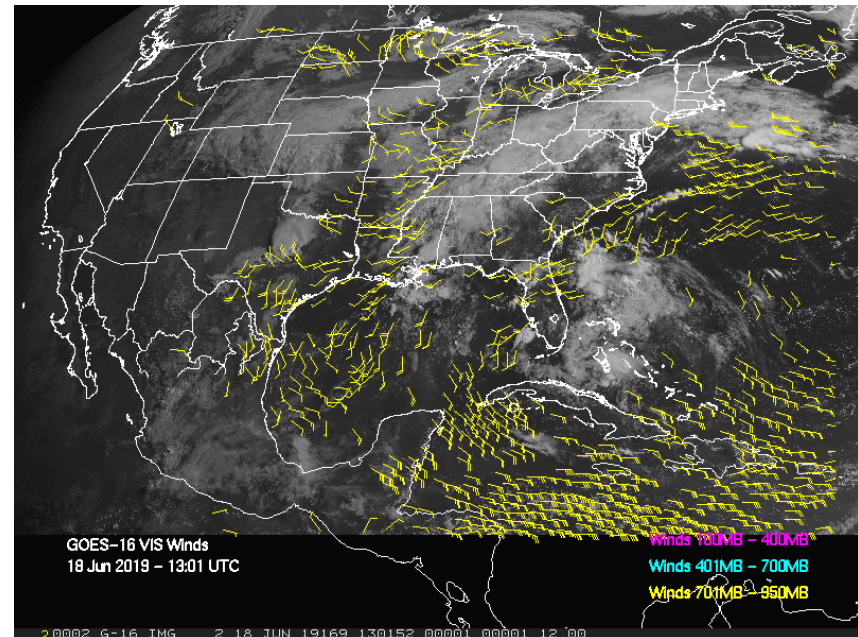
**Full Disk
AMV Product
cadence:**

60 mins



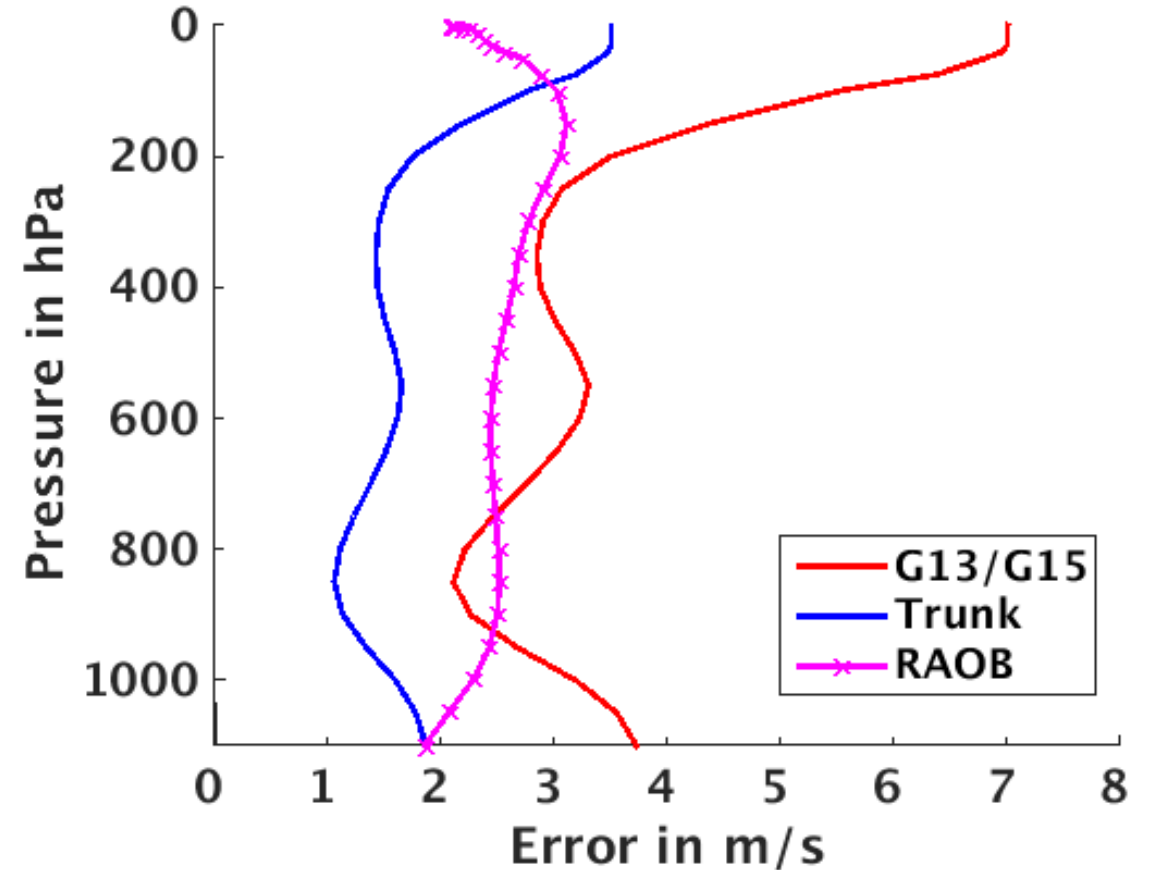
**CONUS
AMV Product
cadence:**

15 mins

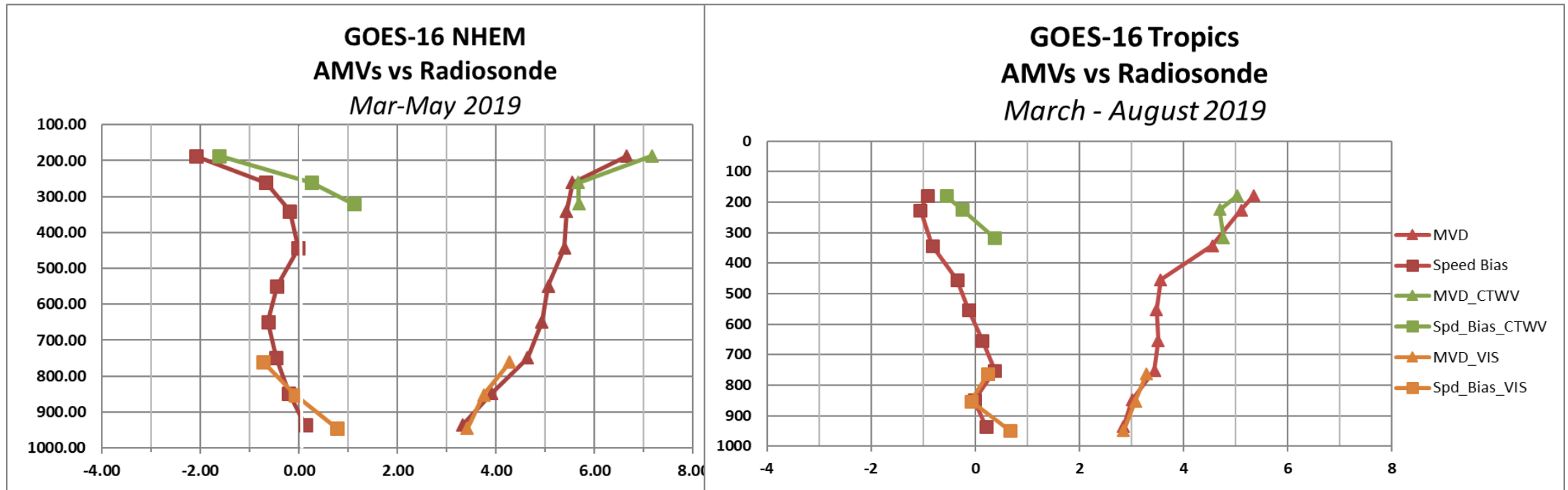


Error Profile

- New code segment in GSI to half the error profile. Code segment is meant for global but also applied to the regional.
- Too small compared to rawinsondes and rmse derived by NESDIS.
- Change to G13/G15 more inline with rawinsonde and NESDIS rmse.



NESDIS Derived AMV RMSE vs. Rawinsonde



AMV Type

Band 2 VIS

Band 8 CTWV

Band 14 LWIR

Squares— speed bias
Triangles – vector difference

RMSE is between 3 to 5.5m/s



Quality information available for data selection

- Quality Indicator (QI)
 - Holmlund 1998
 - calculated by estimating direction consistency, speed consistency, vector consistency and spatial consistency.
 - Values are low if lack of "buddy" AMV.
- PCT1
 - GOES-R nested tracking parameter
 - measure of the standard deviation of the tracked cluster / distance the cluster travelled.

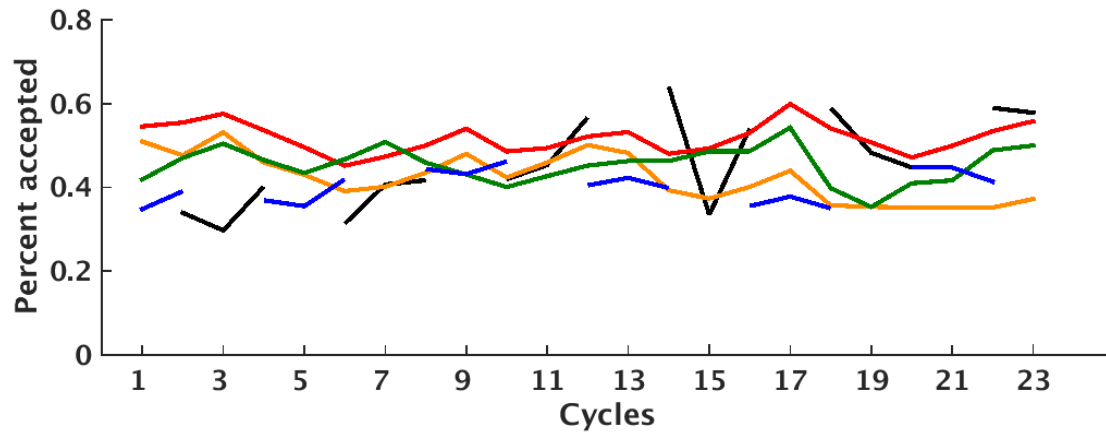
Quality control Procedures

- $QI > 80\%$
- $0.04 < PCT1 < 0.5$ for IR, CTWV, VIS and SWIR AMVs.
- Blacklisting of IR AMVs changed 400 -600 hPa.
 - GOES-16 has more AMVs retrieved between 600-800 hPa compared to GOES-13/15.
- No PCT1 lower check for VIS because it rejected a lot of AMVs.

Forecast impacts (not shown here) from 3 tropical cyclones show neutral impact. Presented at AMS 2020 .

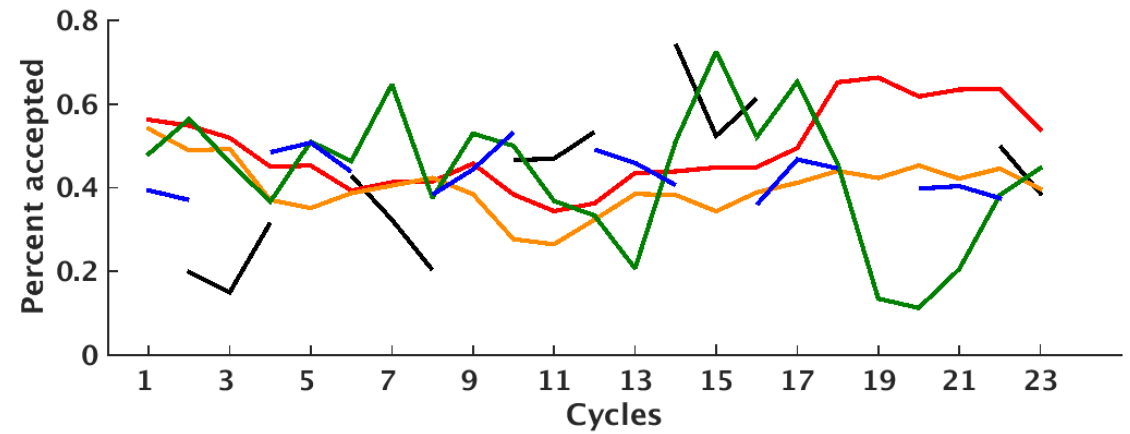
Percentage of AMVs assimilated

DO2



SWIR, IR, CTWV, CAWV, VIS

DO3

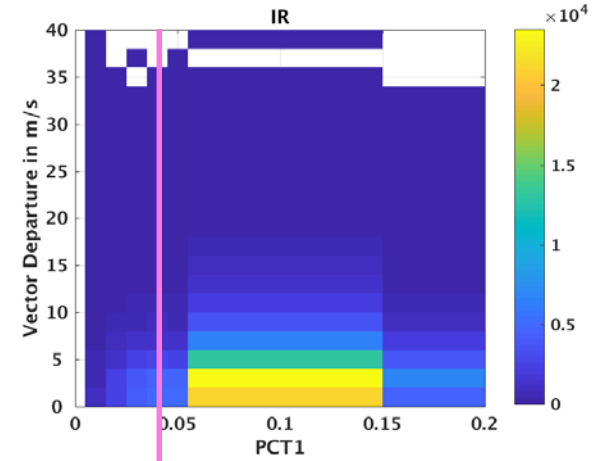
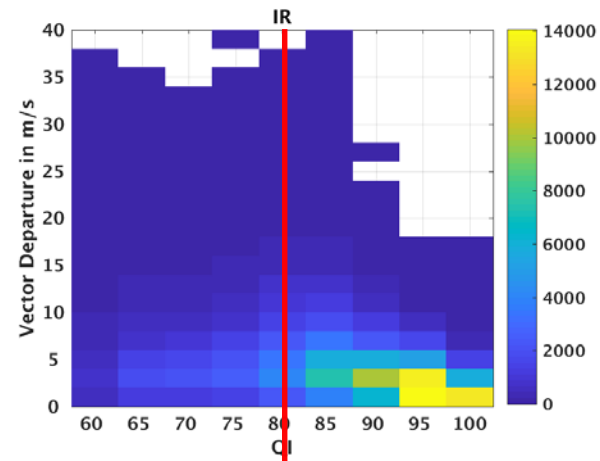
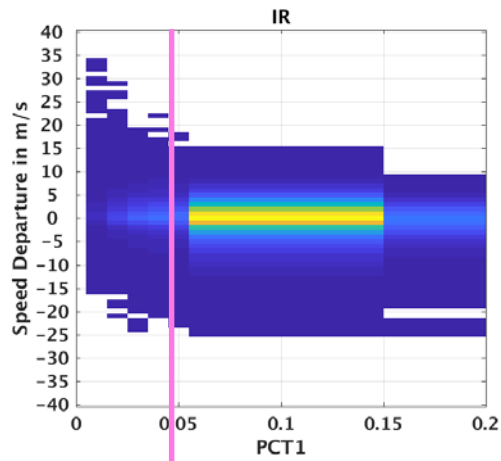
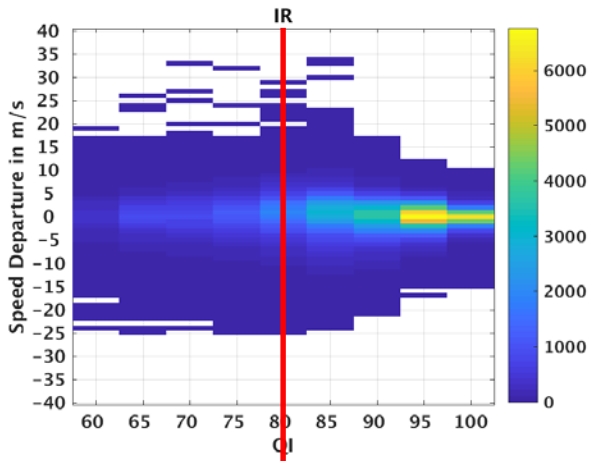


40%-60% of the observations assimilated

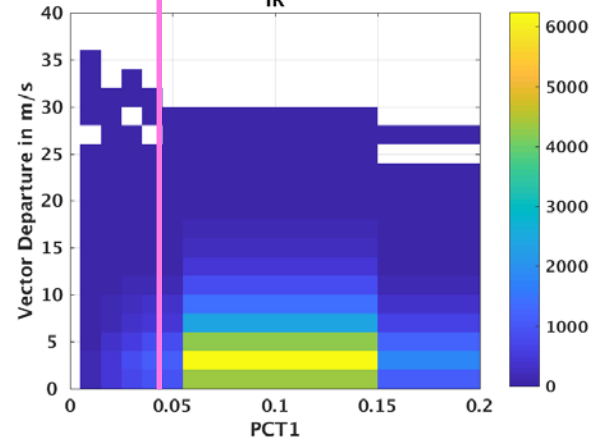
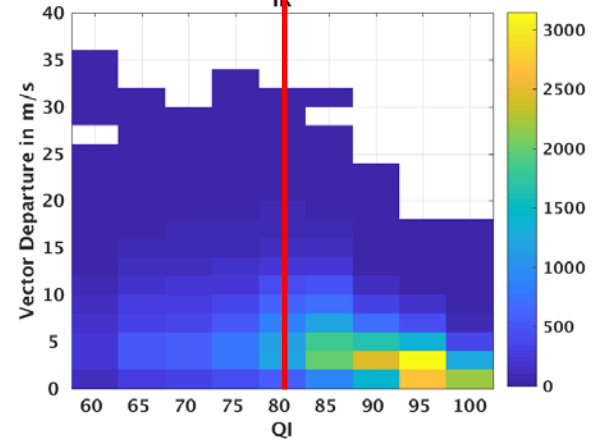
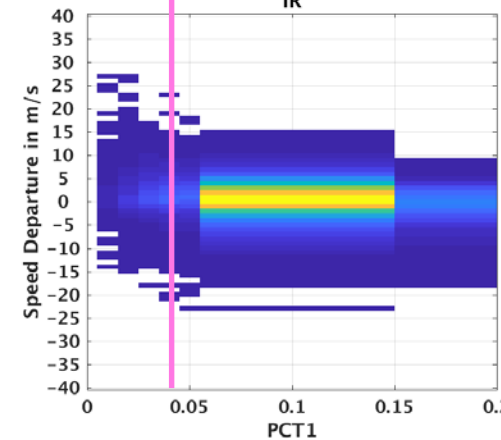
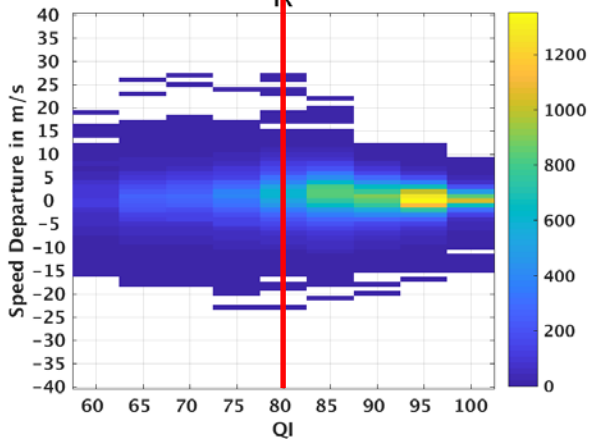
Assimilation perform as G13/G15 AMVs

Density plots of all IR AMVs in the HWRF domains

DO2



DO3

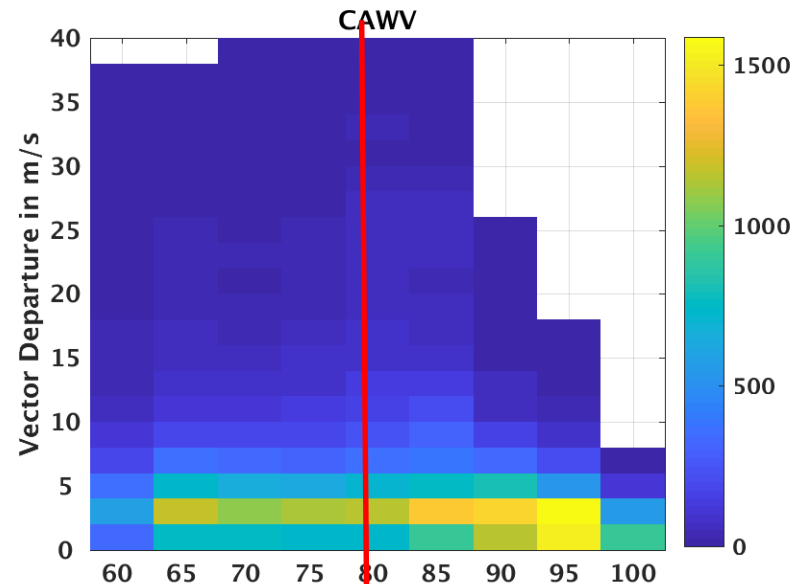
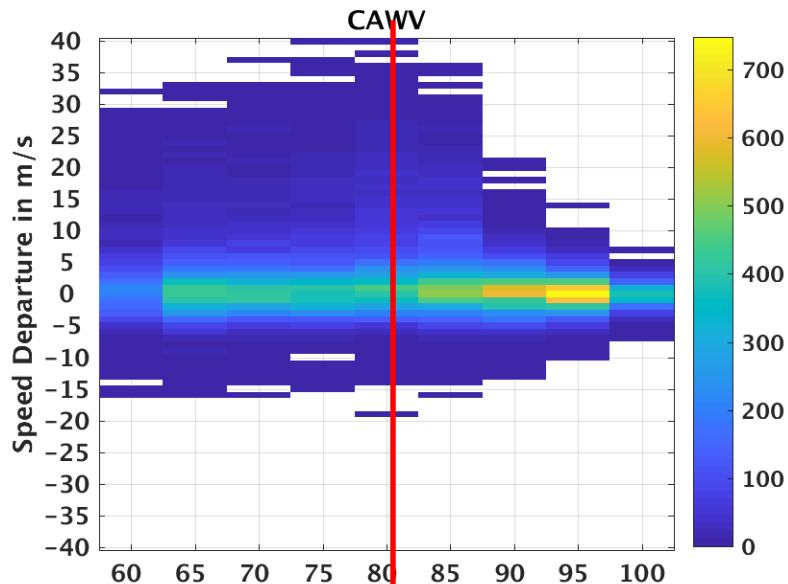


Speed Departures

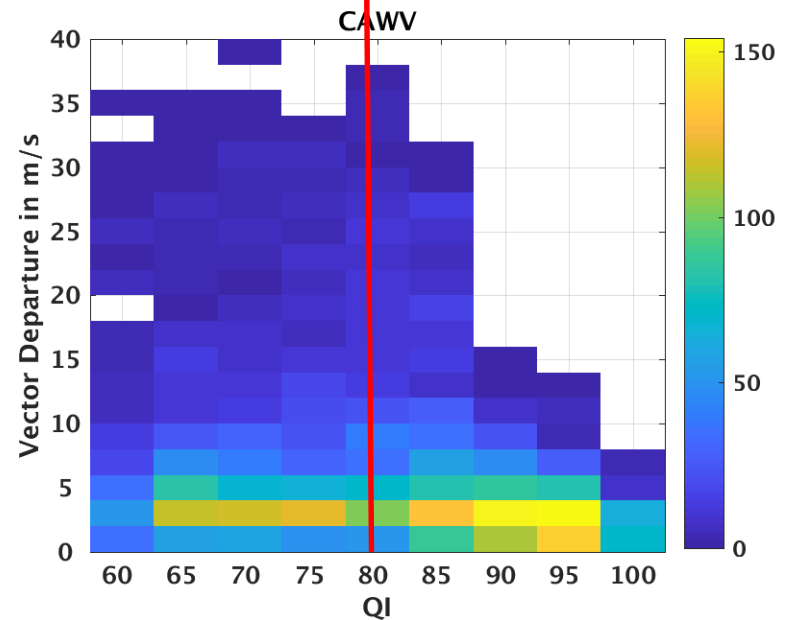
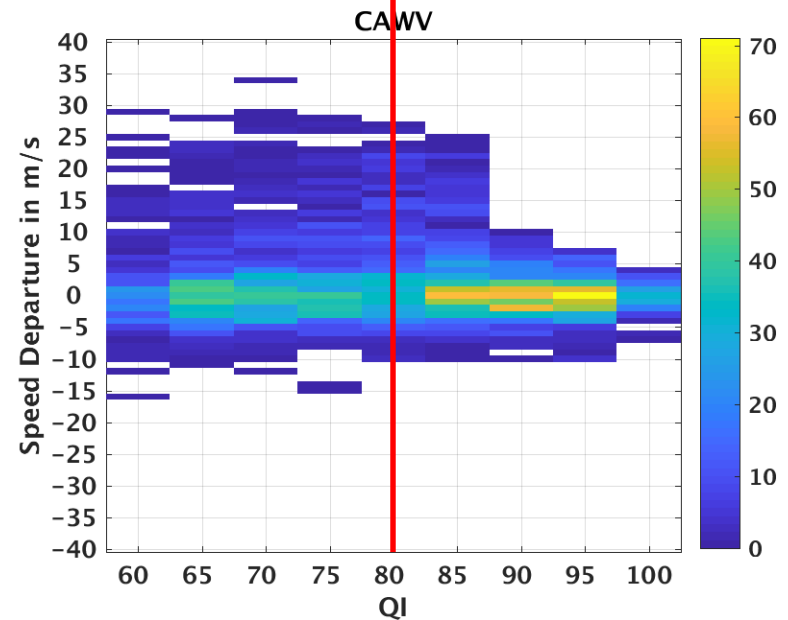
Vector Departures

Density plots of all CAWV AMVs in the HWRF domains

DO2



DO3

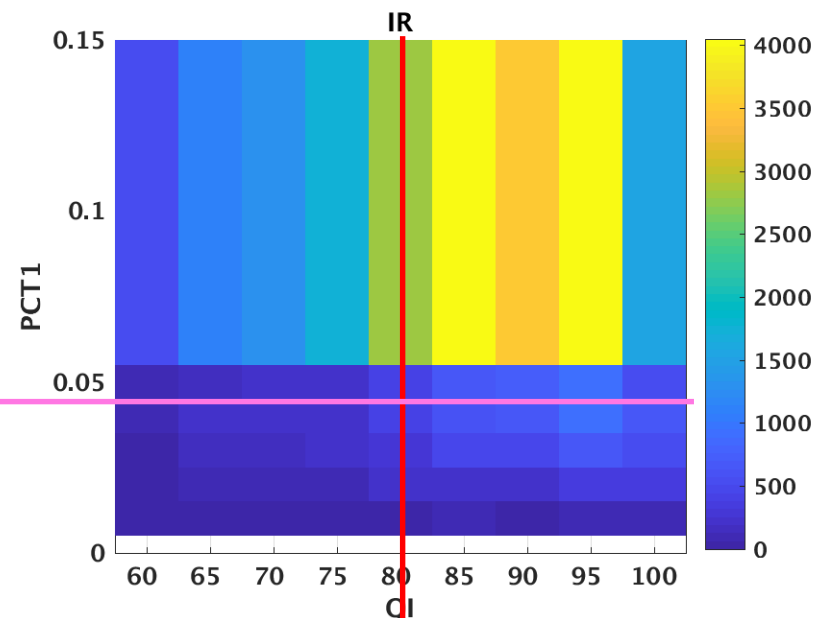
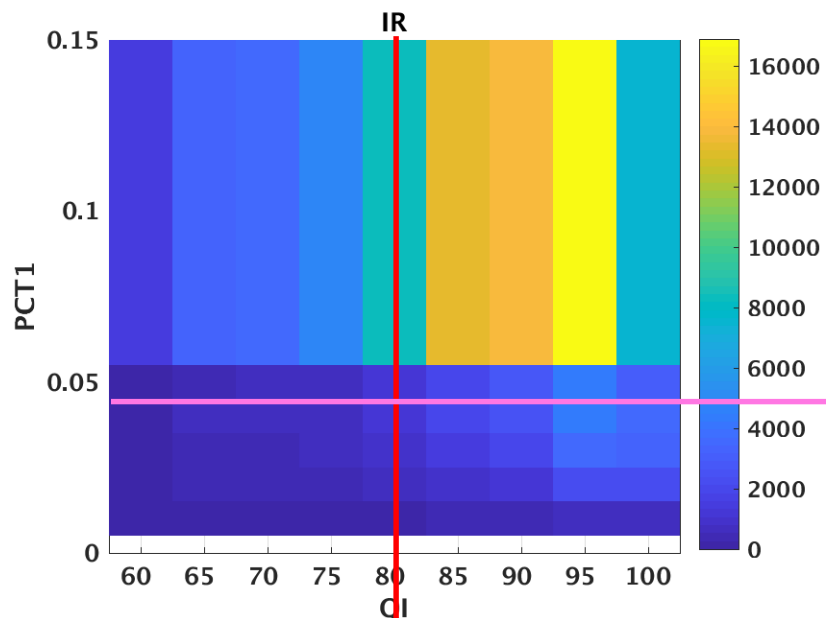


Speed Departures

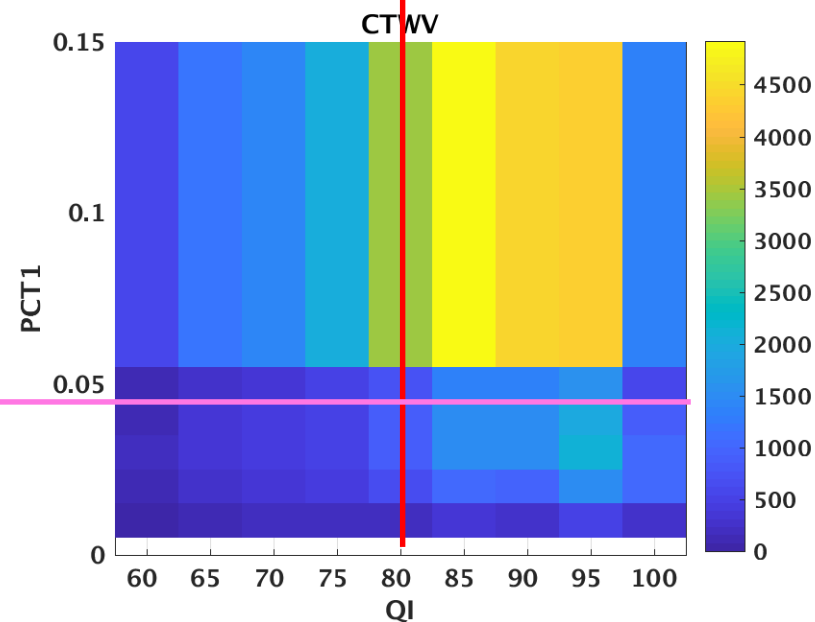
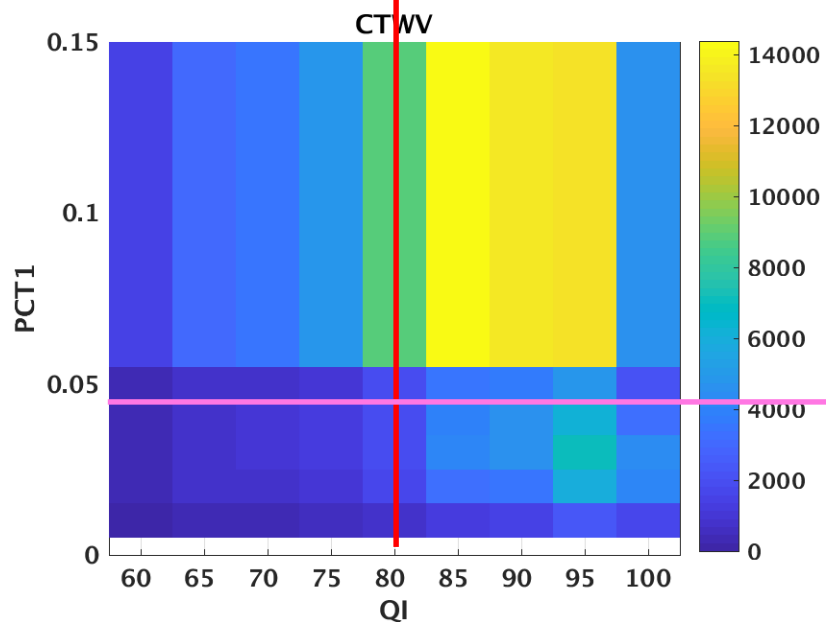
Vector Departures

Density plots of QI vs PCT1

IR AMVs



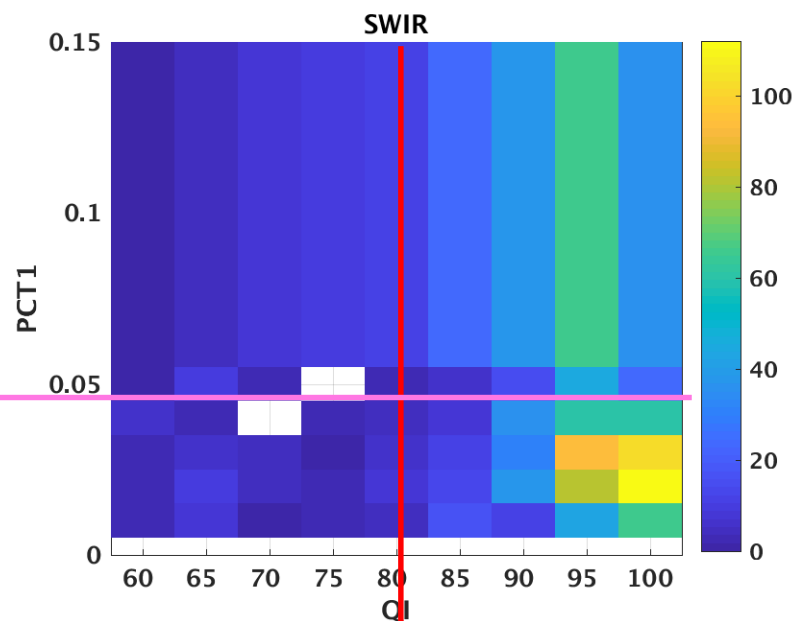
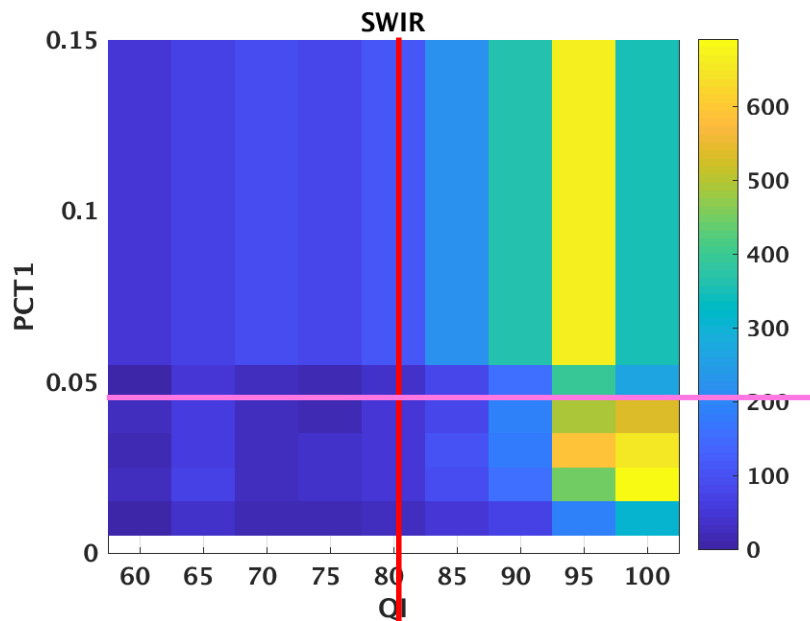
CTWV AMVs



Left column : D02
Right column : D03

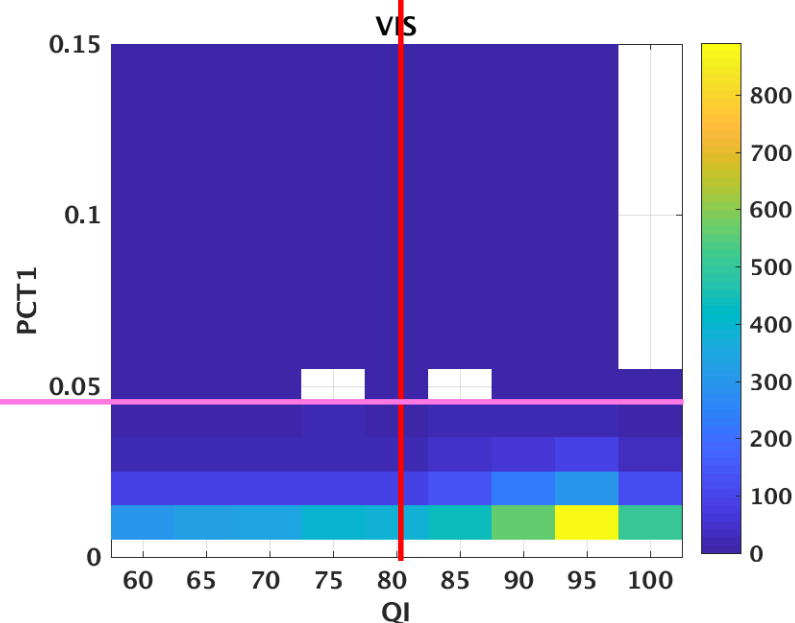
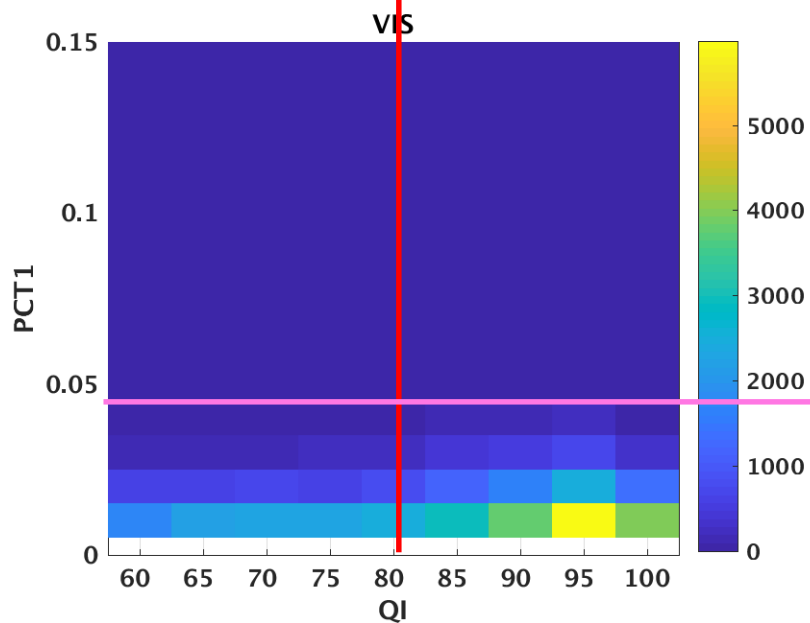
Density plots of PCT1 vs QI

SWIR
AMVs



Left column : D02
Right column : D03

VIS AMVs

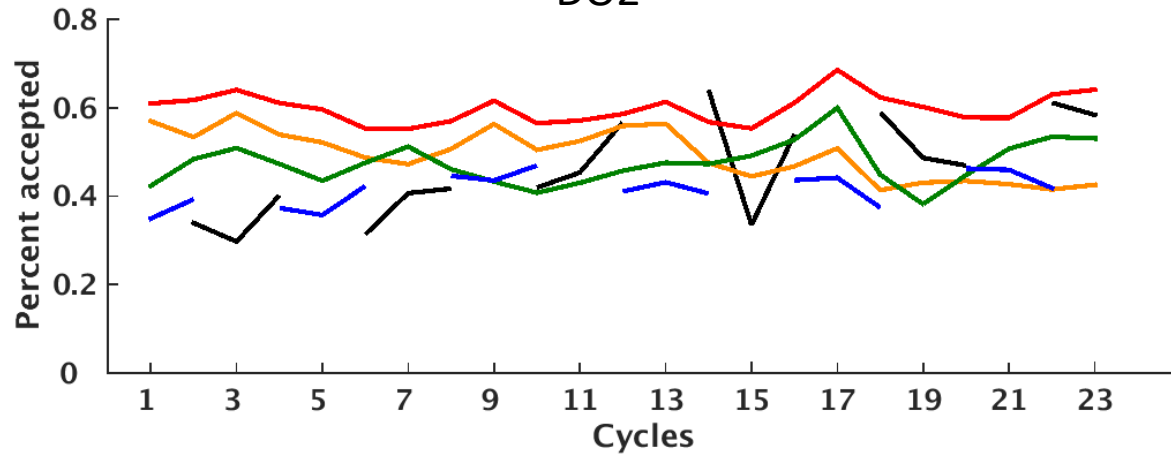


Percentage of AMVs assimilated

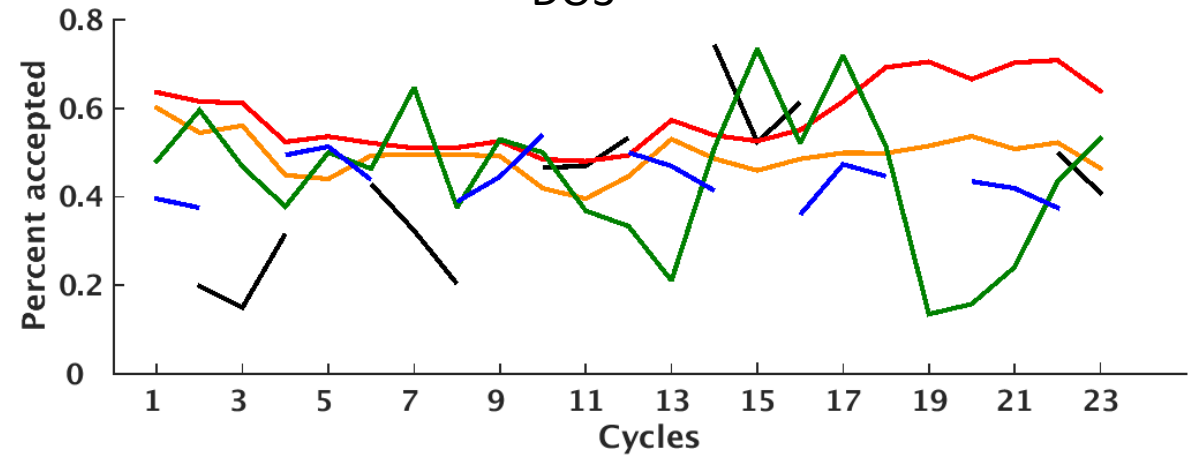
20 -40% increase in AMVs assimilated

Without removal of QI and PCT1 check

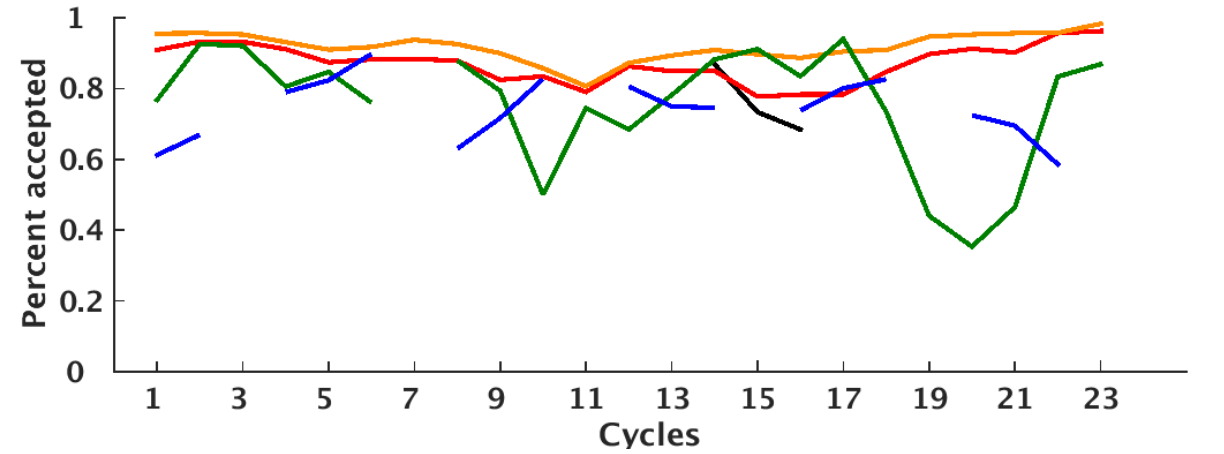
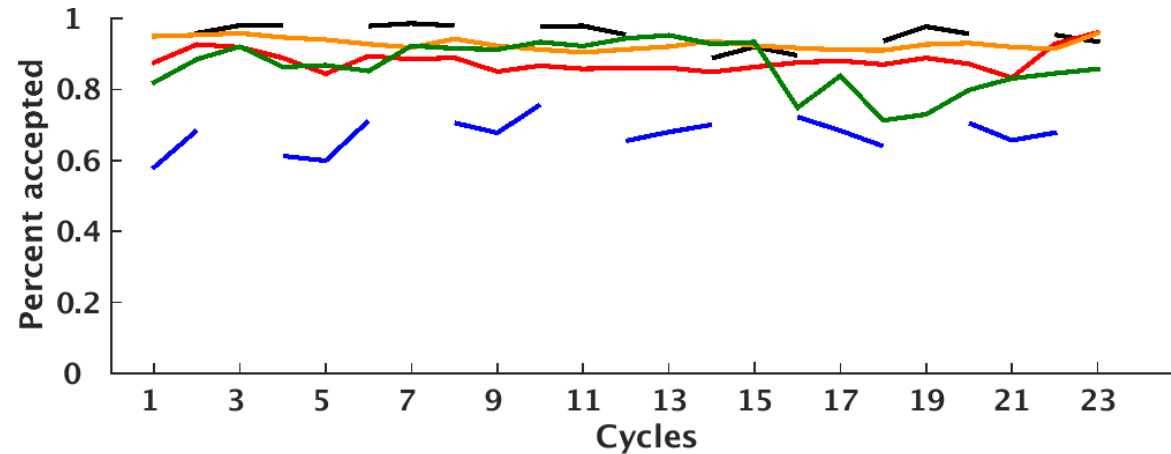
DO2



DO3



With removal of QI and PCT1 check

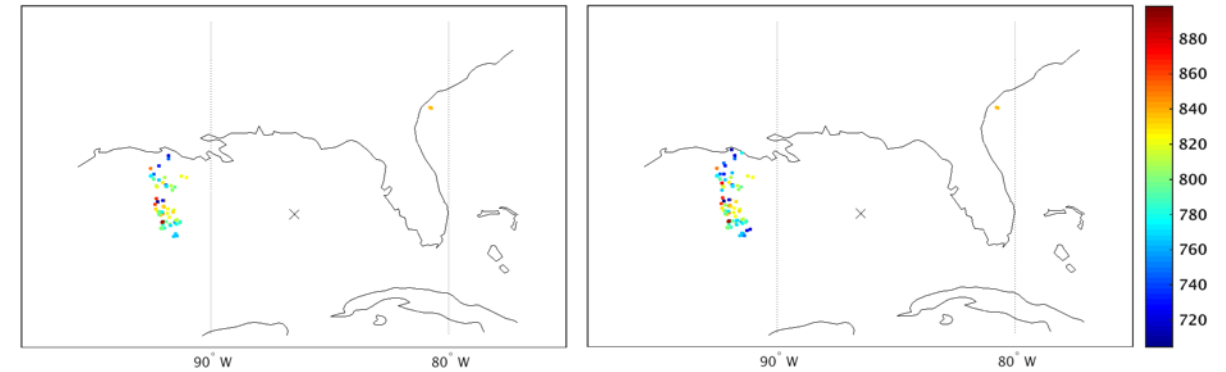
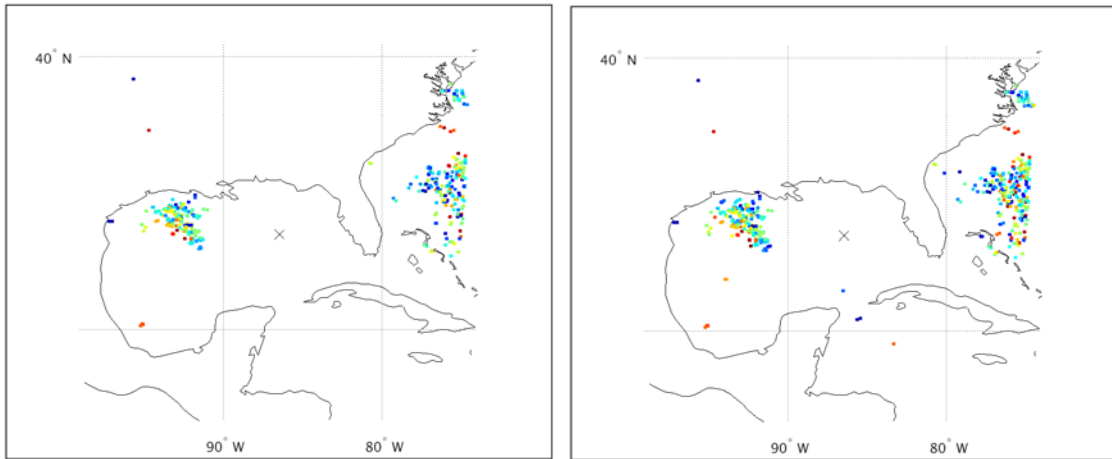
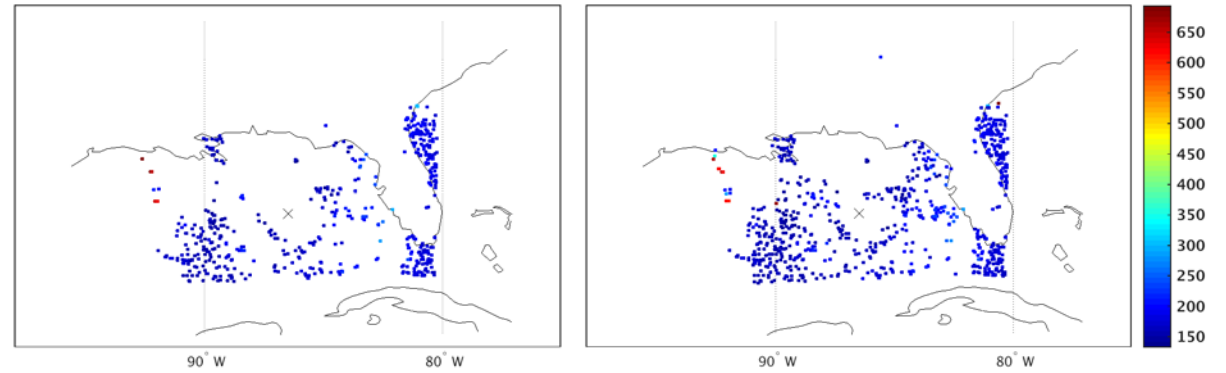
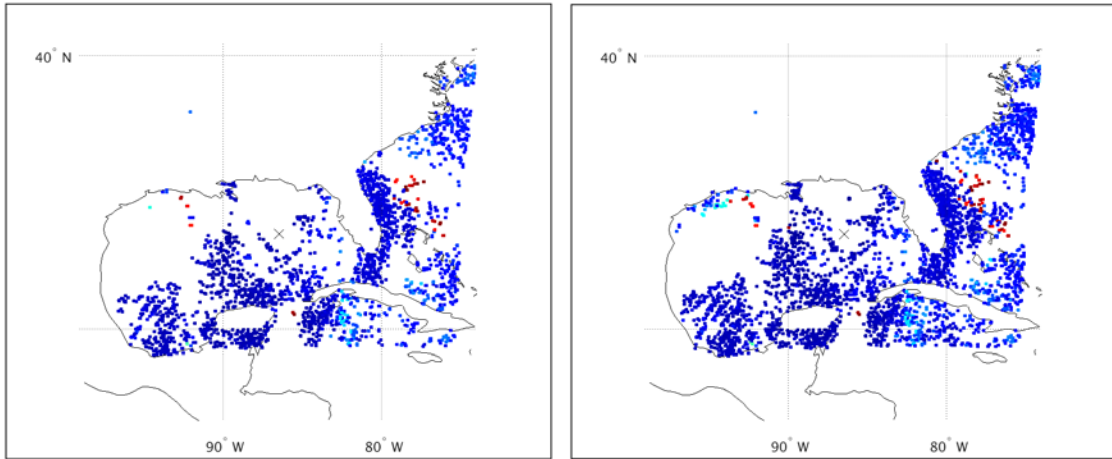


SWIR, IR, CTWV, CAWV, VIS

20181010 12z Strongest cycle of Hurricane Michael

D02

D03



Assimilated IR AMVs :

Height of AMV - color coded

Above 400 hPa (Top row)

Below 700 hPa (Bottom row)

NHC storm center marked with a "X"

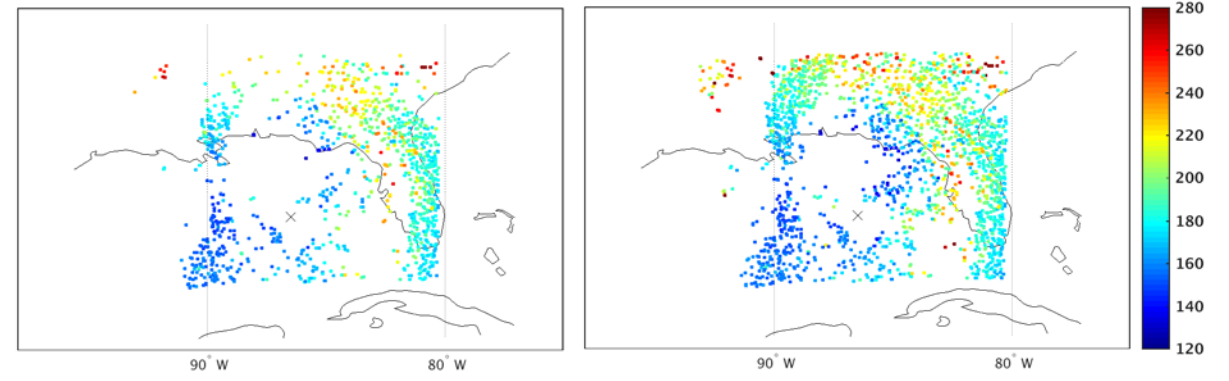
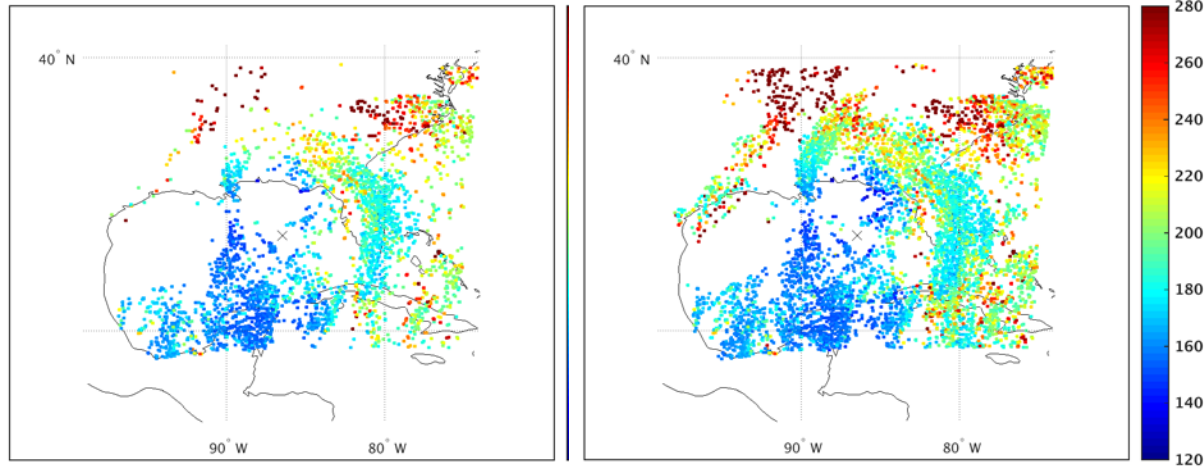
With QI and PCT1 check (left column)

Without QI and PCT1 check (right column)

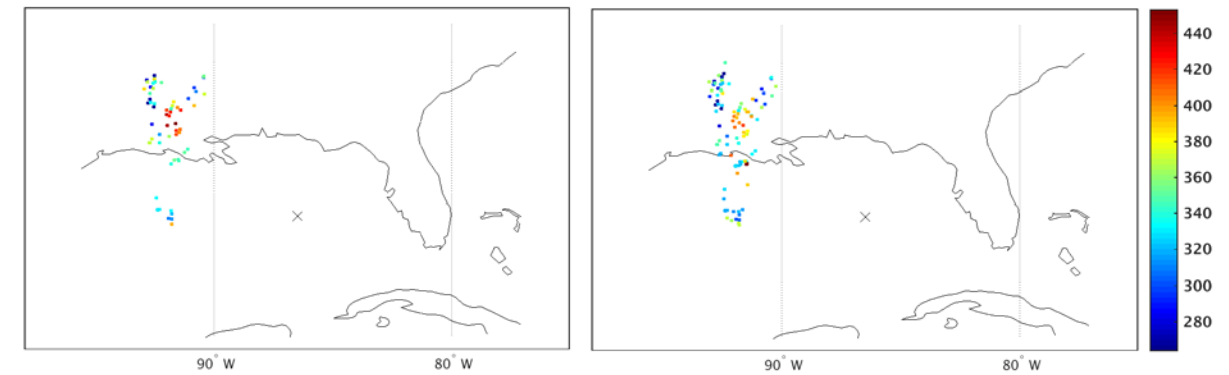
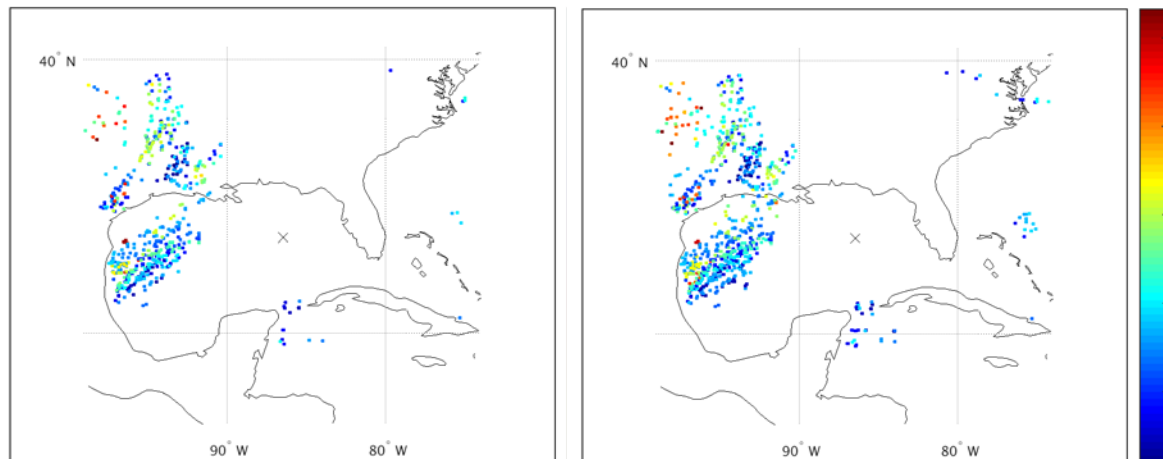
D02

D03

CTWV



CAWV



Assimilated AMVs

Height of AMV - color coded

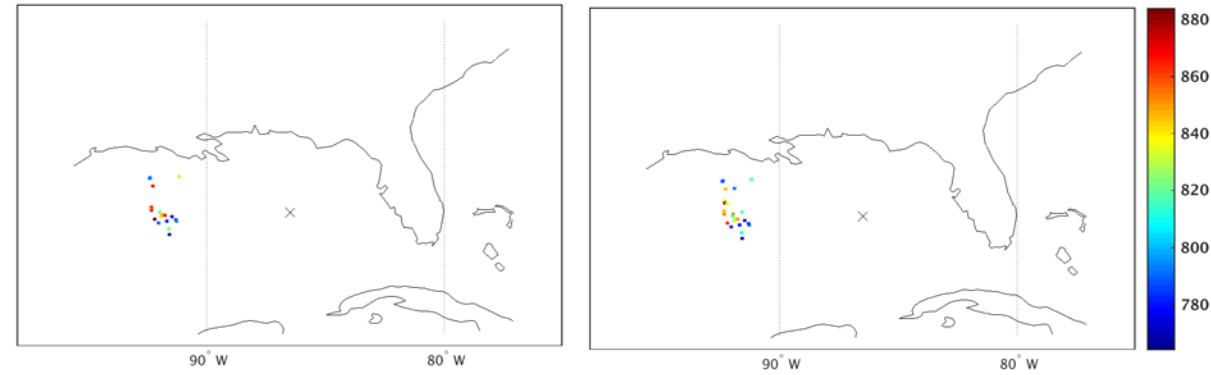
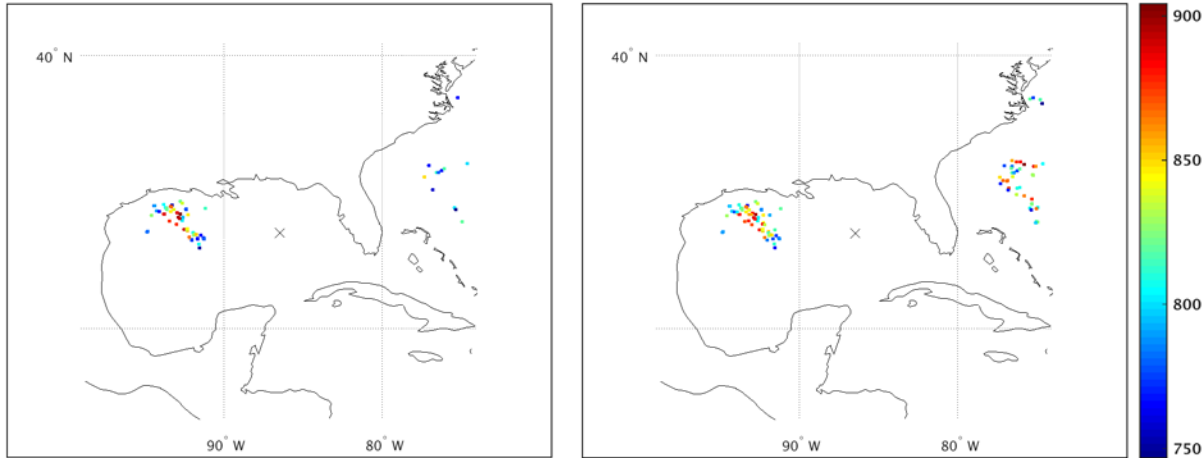
With QI and PCT1 check (left column)

Without QI and PCT1 check (right column)

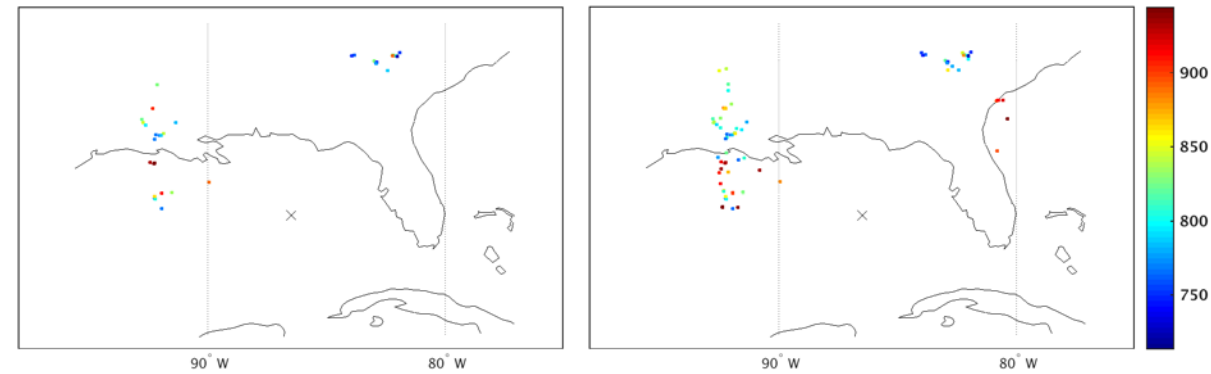
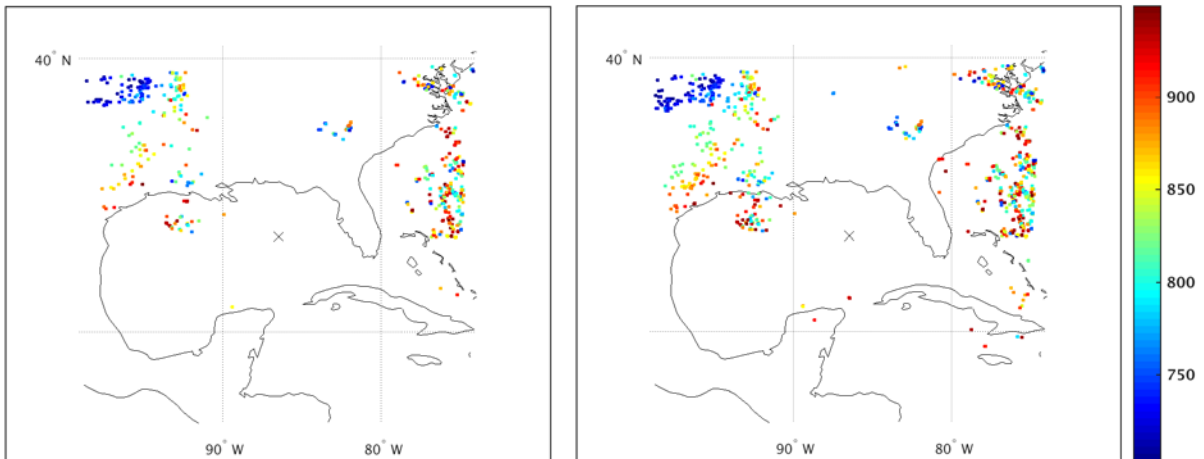
D02

D03

SWIR



VIS



Assimilated AMVs

Height of AMV - color coded

With QI and PCT1 check (left column)

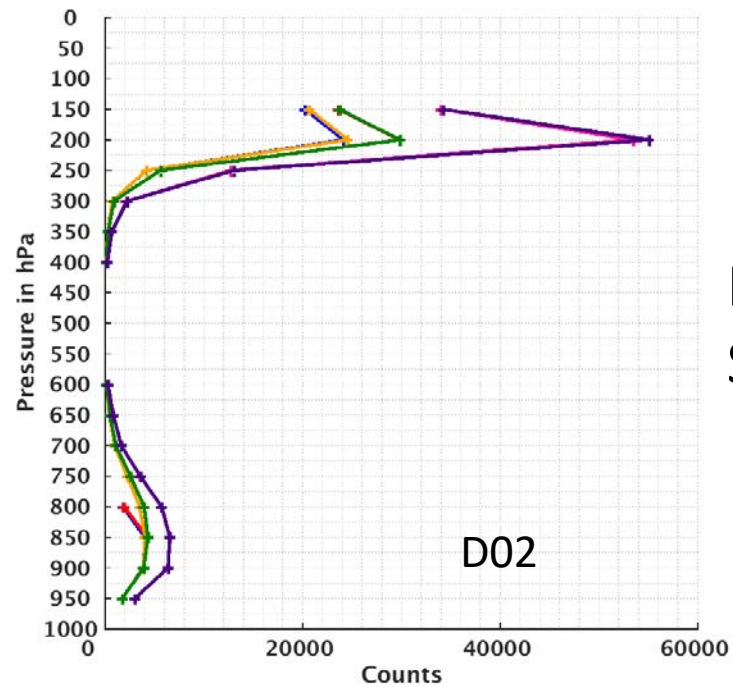
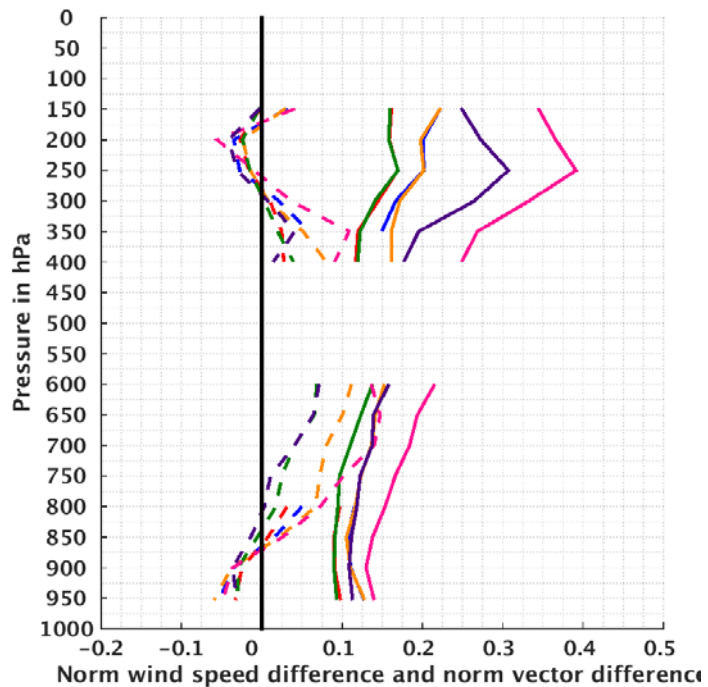
Without QI and PCT1 check (right column)

Quality control Procedures

- No data rejection based on QI
- Drop $PCT1 < 0.04$ for IR, CTWV and SWIR AMVs.
- Gross check ratio relaxed.
- Blacklisting of IR AMVs changed 400 -600 hPa.
 - GOES-16 has more AMVs retrieved between 600-800 hPa compared to GOES-13/15.

Experiments

	CTRL	AMV1	AMV2
AMV types	IR, CTWV, CAWV	IR, CTWV, CAWV, , SWIR and VIS	IR, CTWV, CAWV, SWIR and VIS
Gross error check	1.3 For IR and CTWV 2.5 for CAWV	1.3 For IR and CTWV 2.5 for CAWV, SWIR and VIS	3.5 for IR, CTWV, CAWV, SWIR and VIS
Error Profile	3.8m/s (1100hPa) and 7m/s (0 hPa)	3.8m/s (1100hPa) and 7m/s (0 hPa)	3.8m/s (1100hPa) and 7m/s (0 hPa)
QC		IR AMVs removed between 400-800mb	IR AMVs removed between 400-600mb No Q1 check, No PCT1 lower bound check

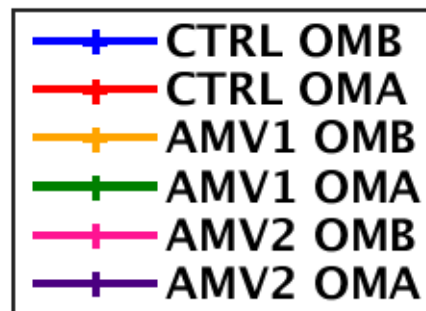
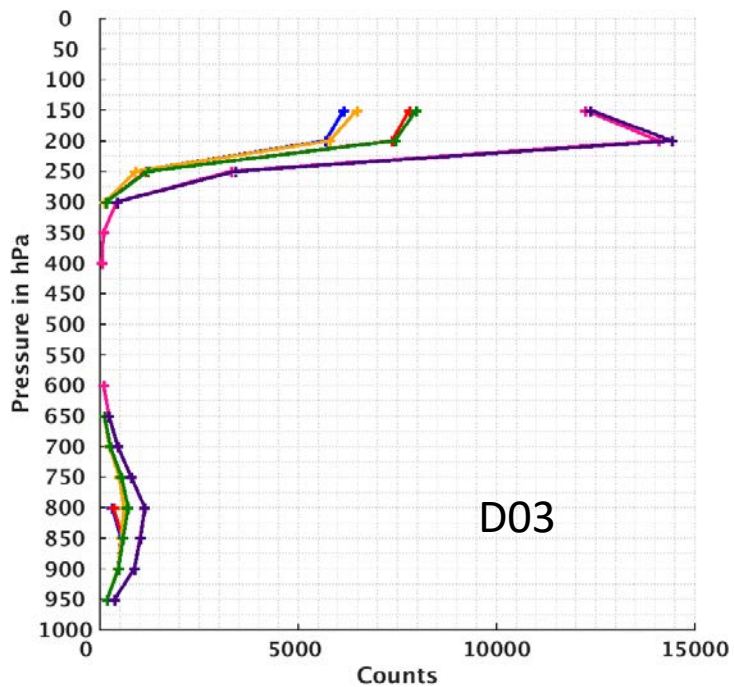
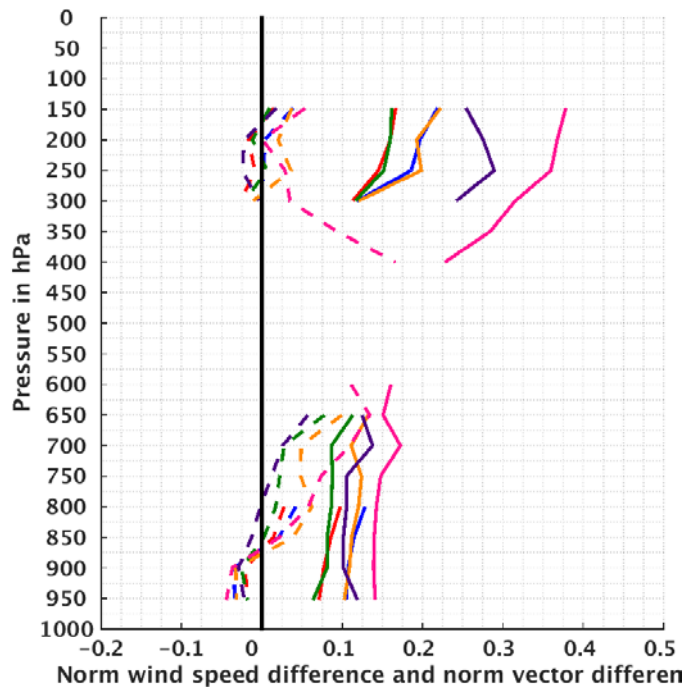


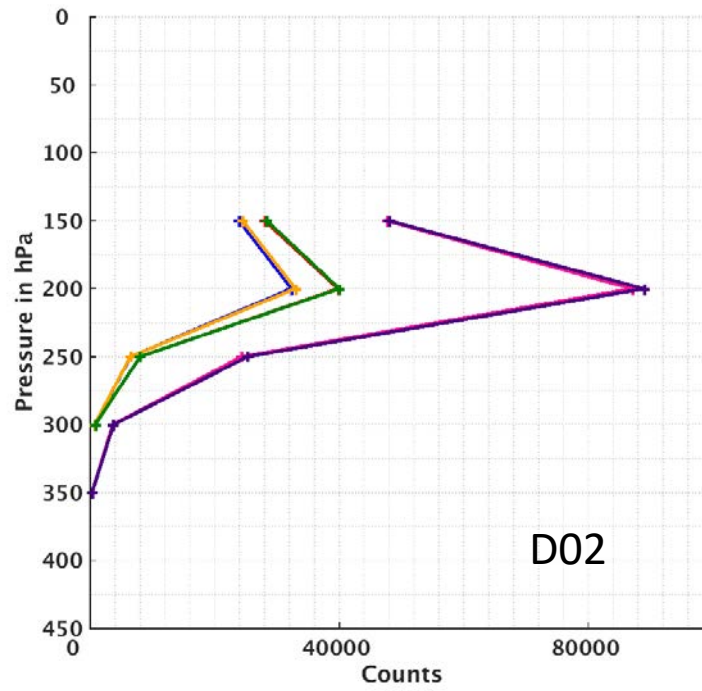
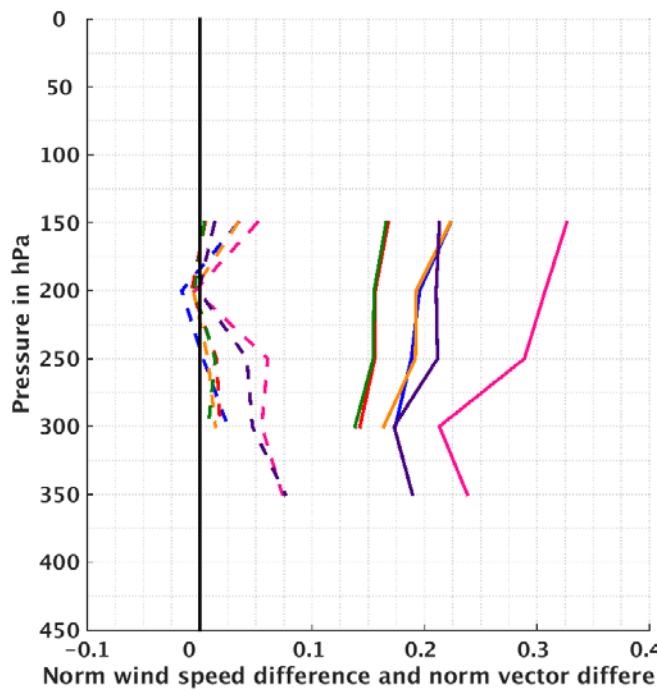
Stats not plotted for counts < 100

Dashed line – Bias

Solid line – Standard deviation

IR AMVs



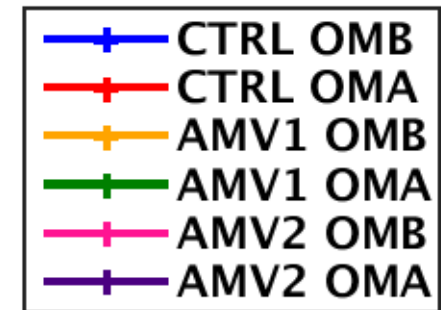
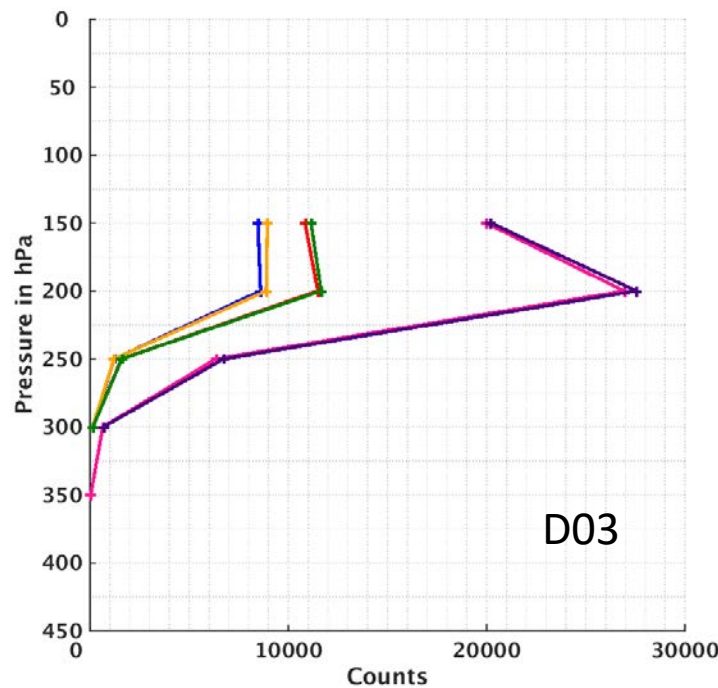
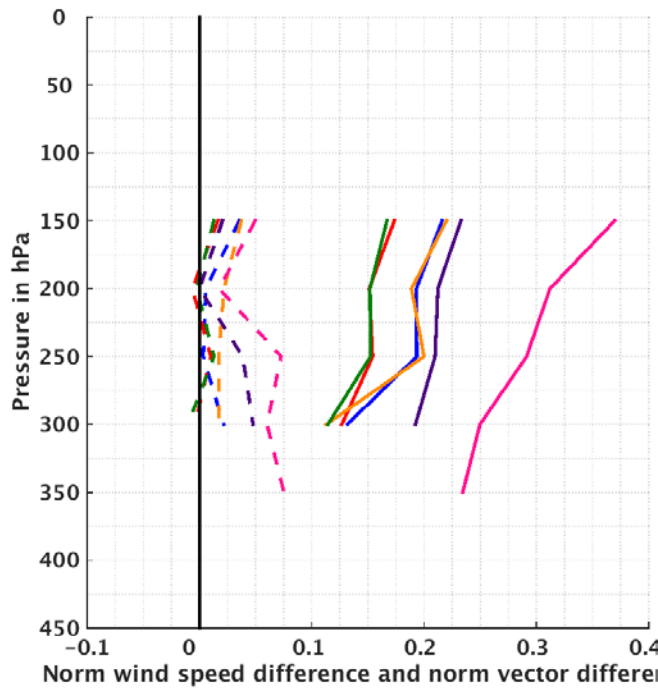


Stats not plotted for counts < 100

Dashed line – Bias

Solid line – Standard deviation

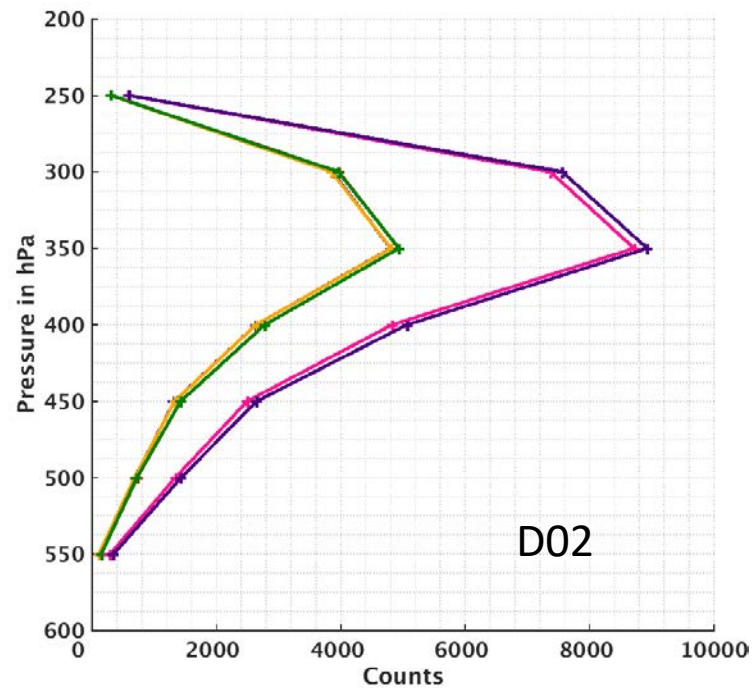
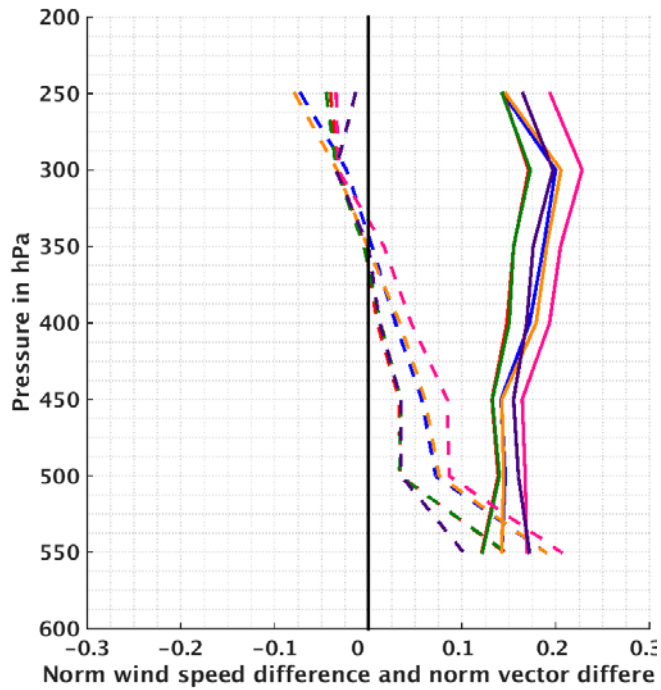
CTWV AMVs



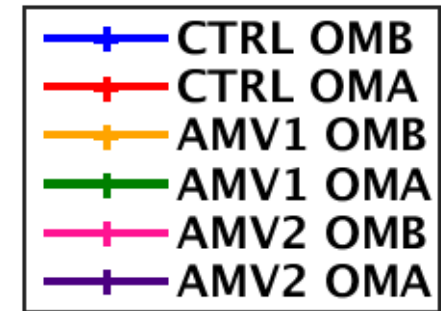
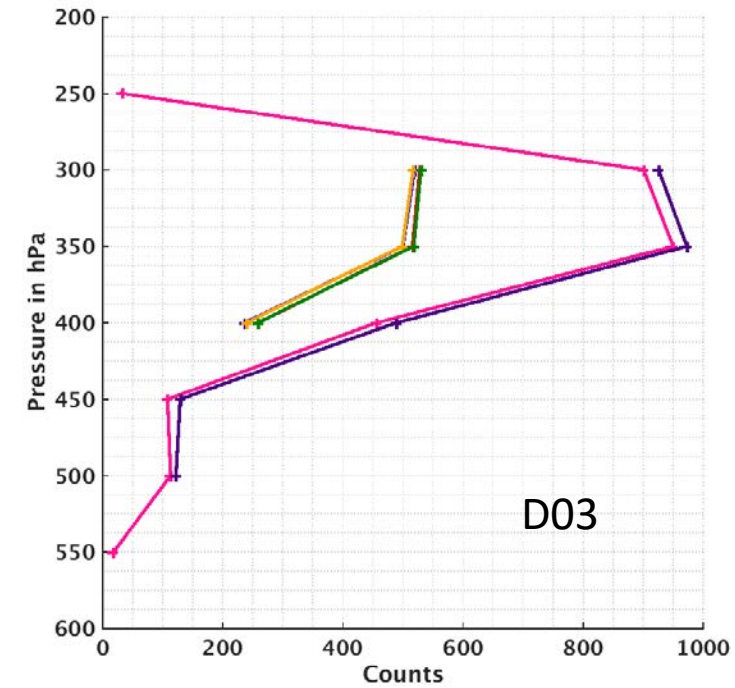
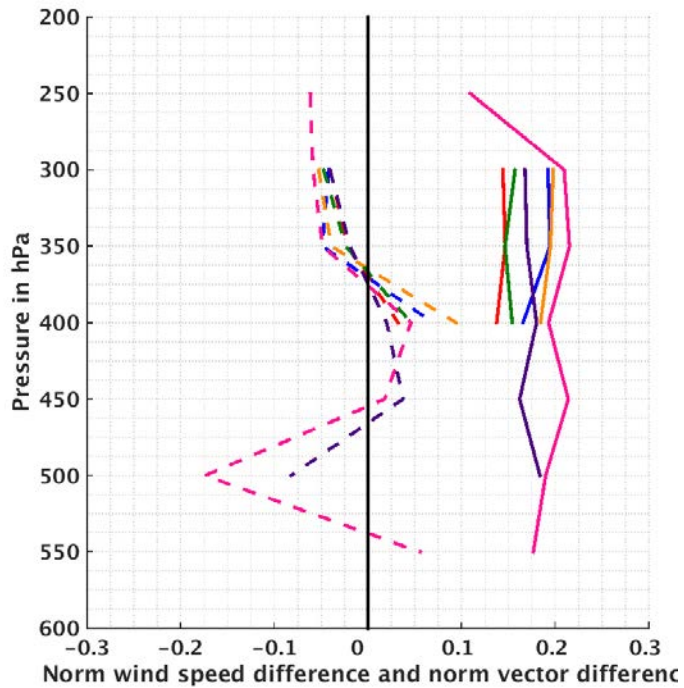
Stats not plotted for counts < 100

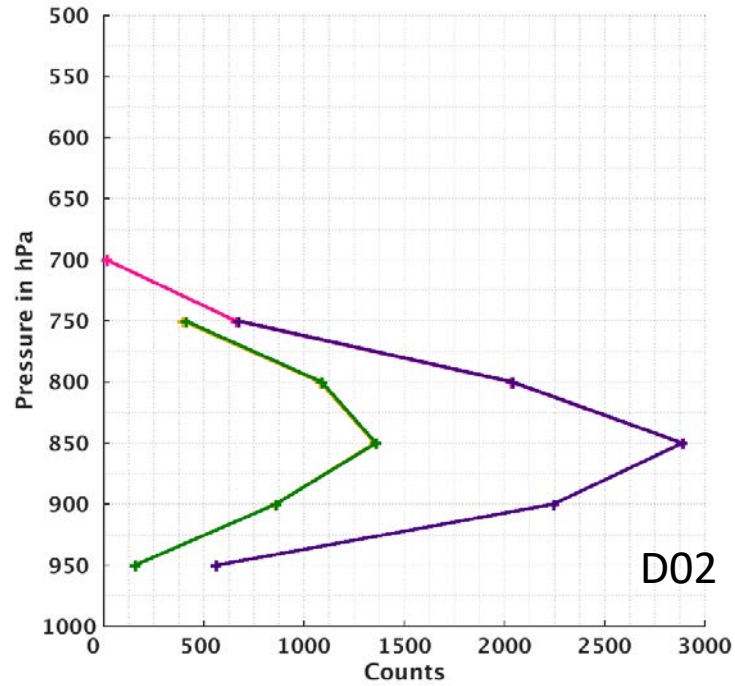
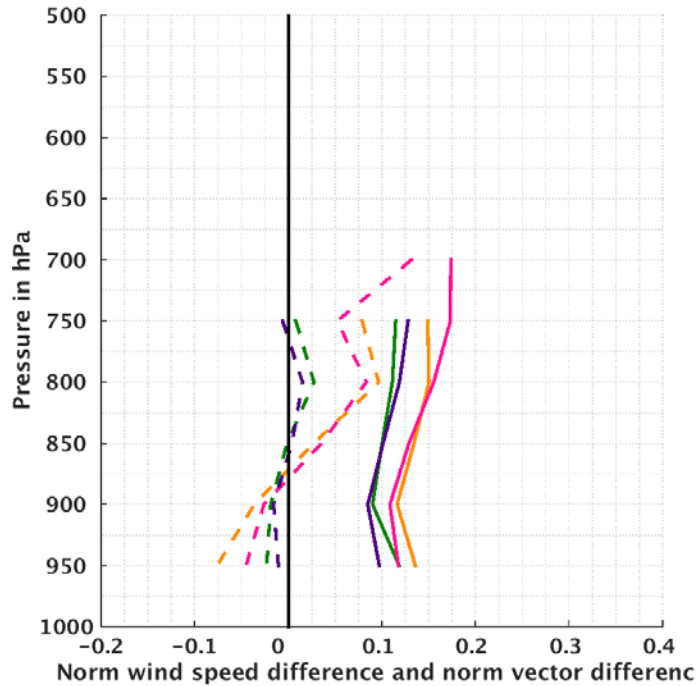
Dashed line – Bias

Solid line – Standard deviation



CAWV AMVs



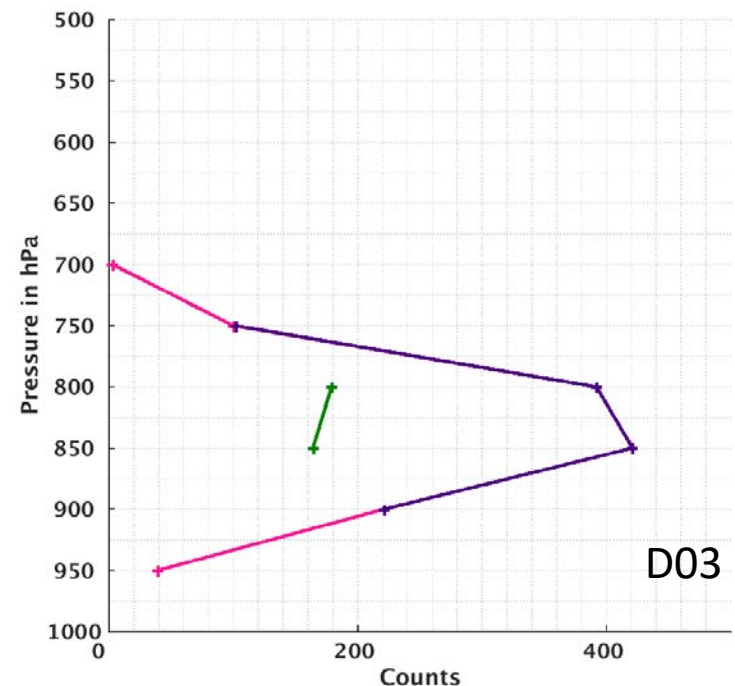
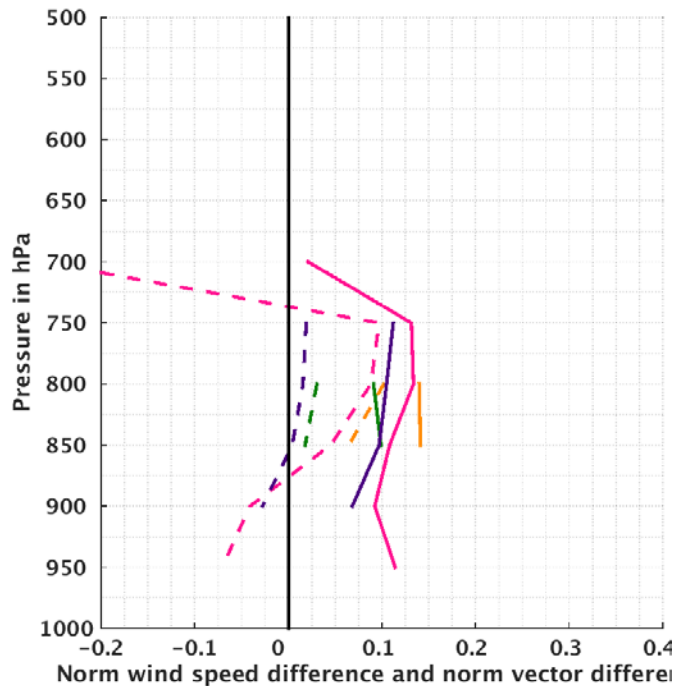


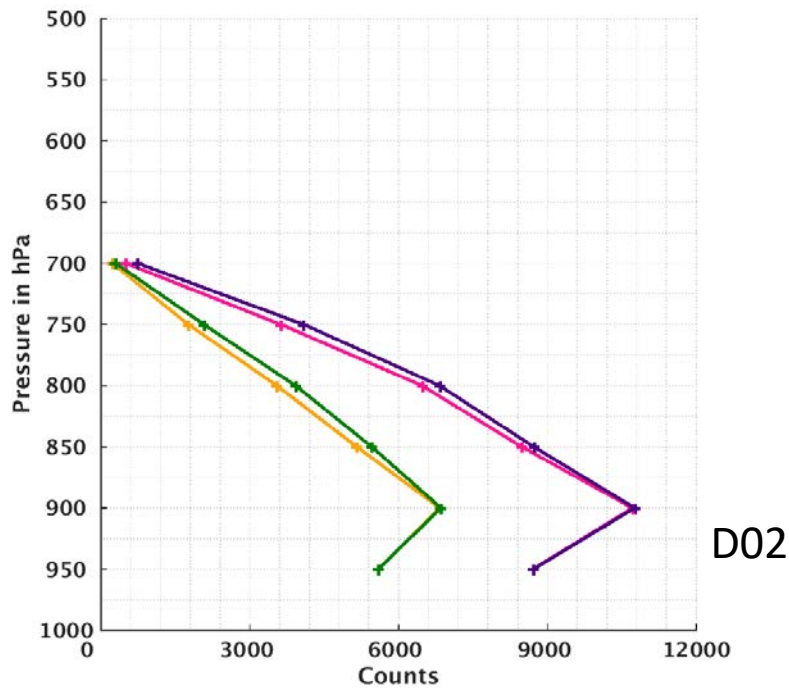
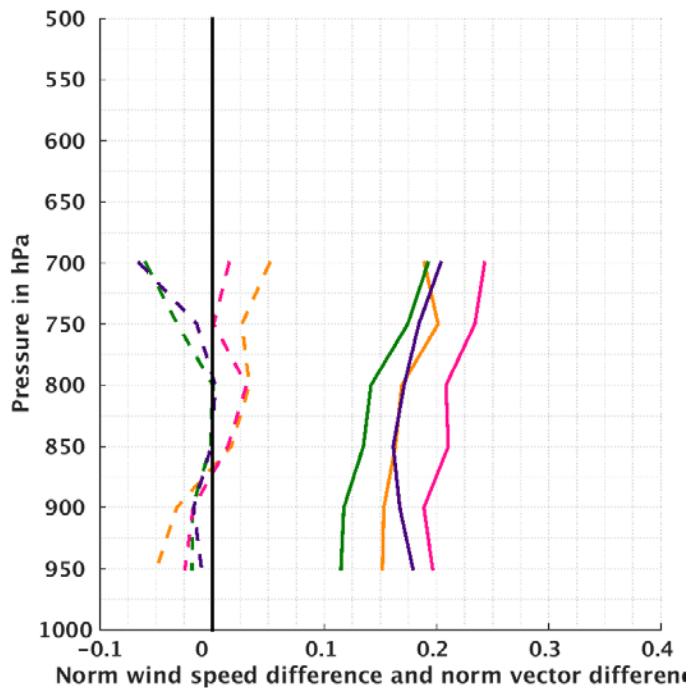
Stats not plotted for counts < 100

Dashed line – Bias

Solid line – Standard deviation

SWIR AMVs



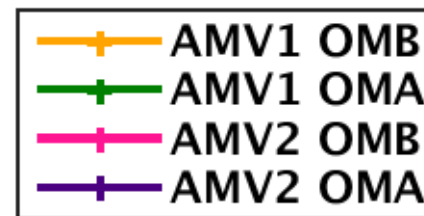
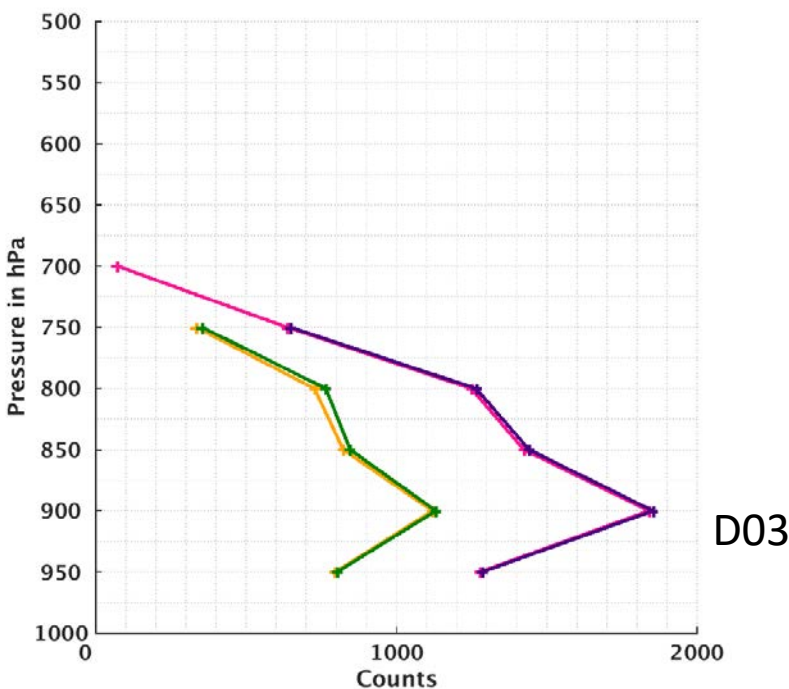
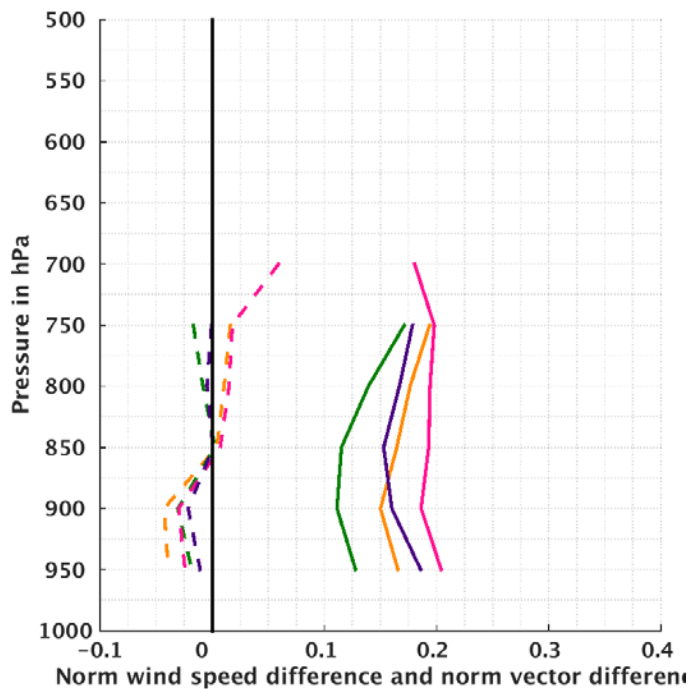


Stats not plotted for counts < 100

Dashed line – Bias

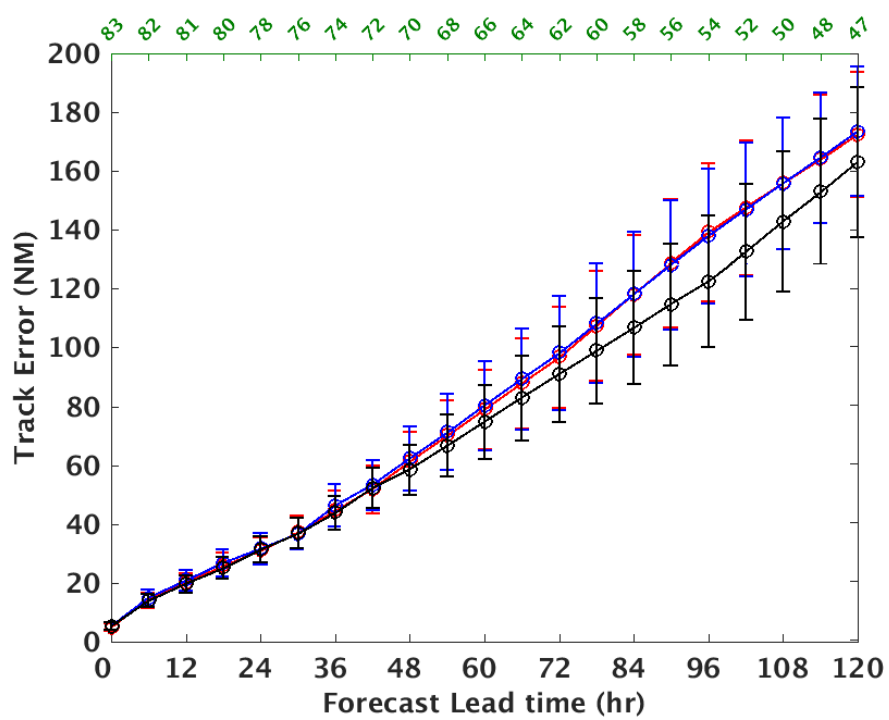
Solid line – Standard deviation

VIS AMVs



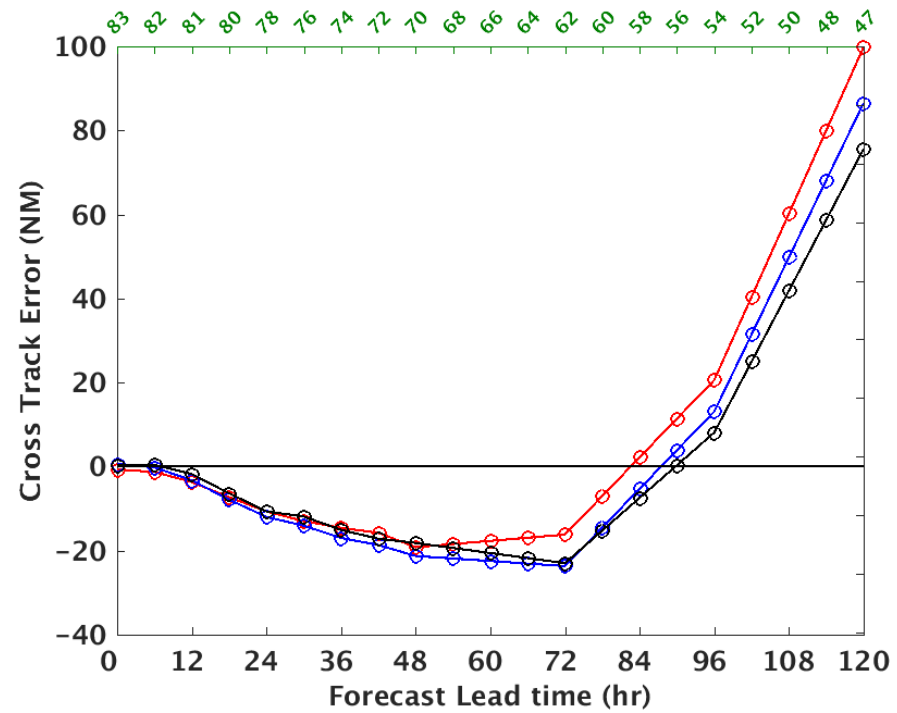
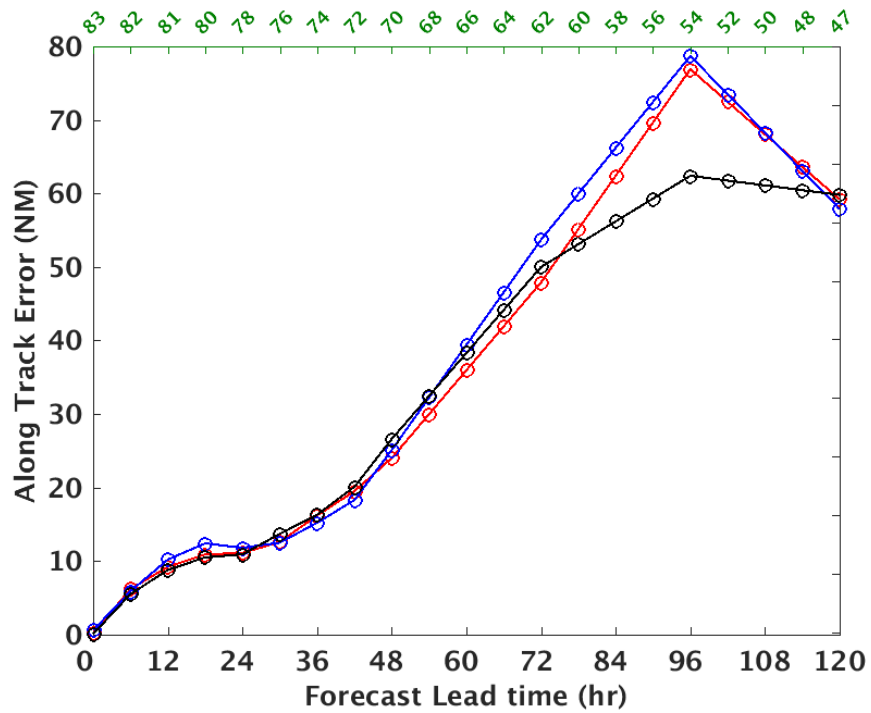
Forecast Impacts from two storms

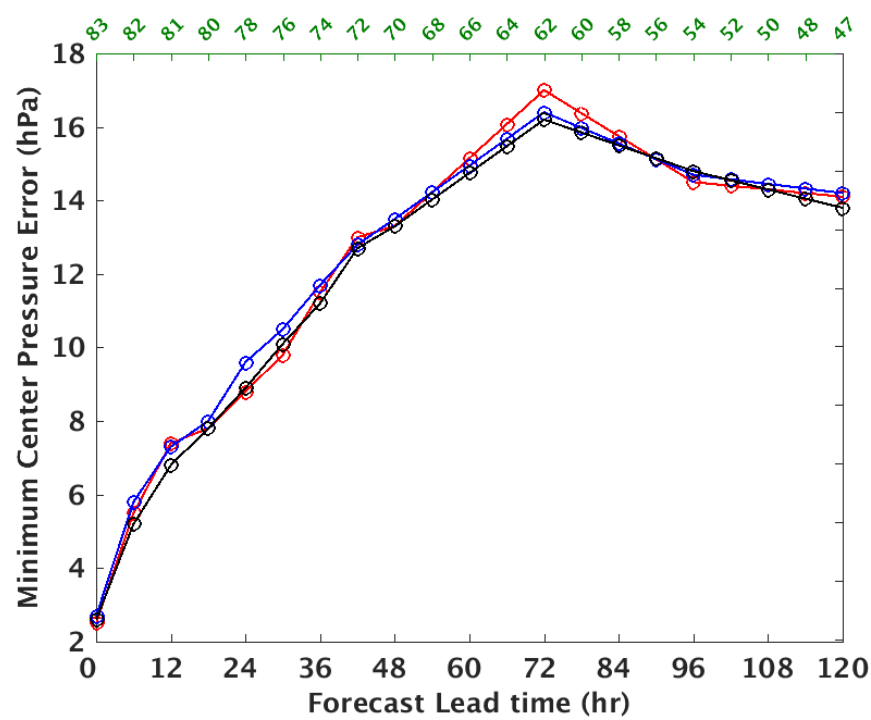
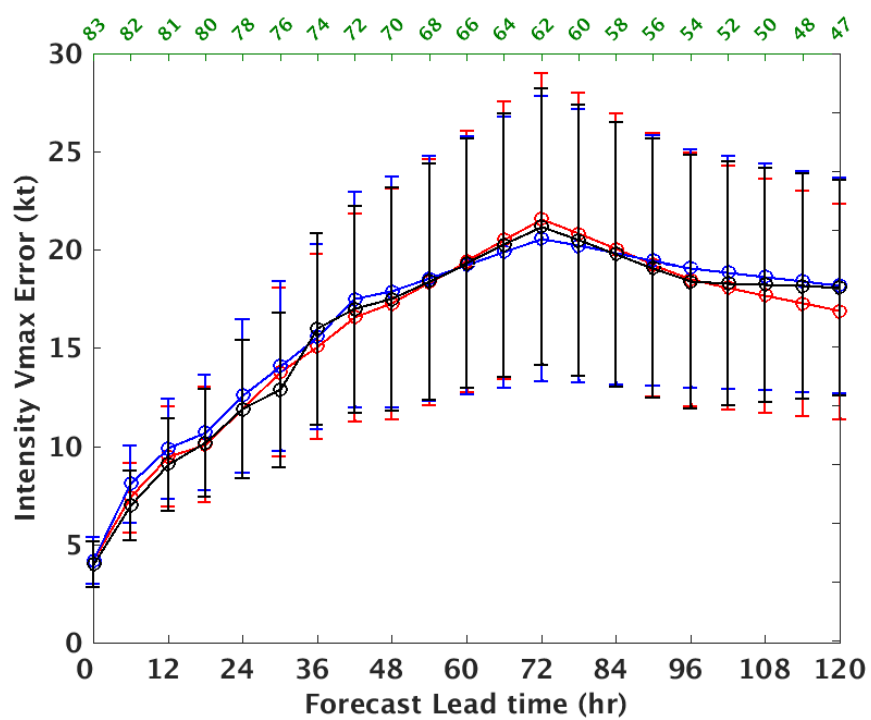
- Hurricane Michael
- Hurricane Florence : verification statistics do not include the period when TC becomes tropical depression



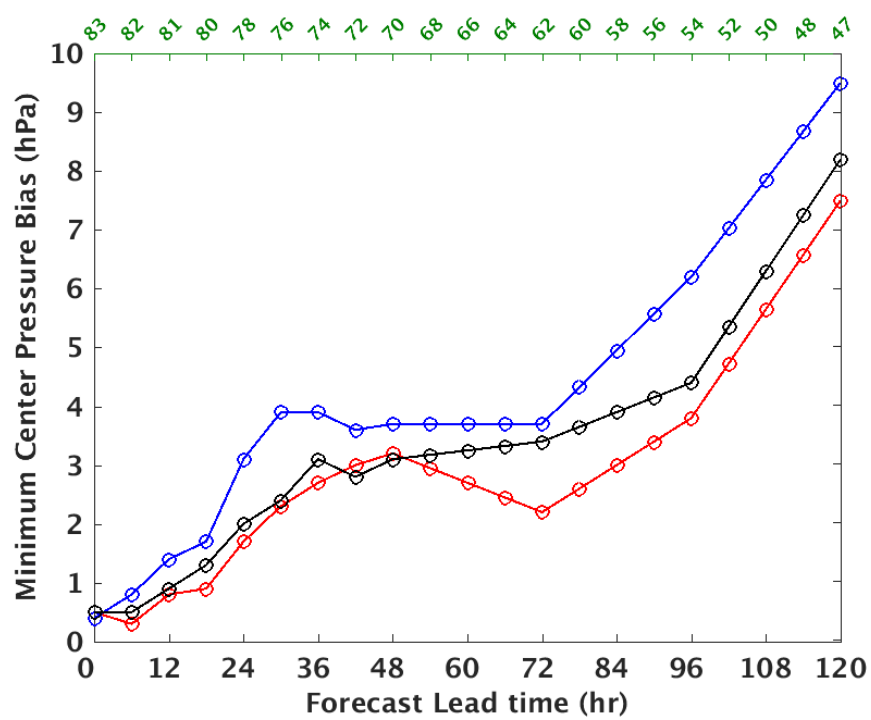
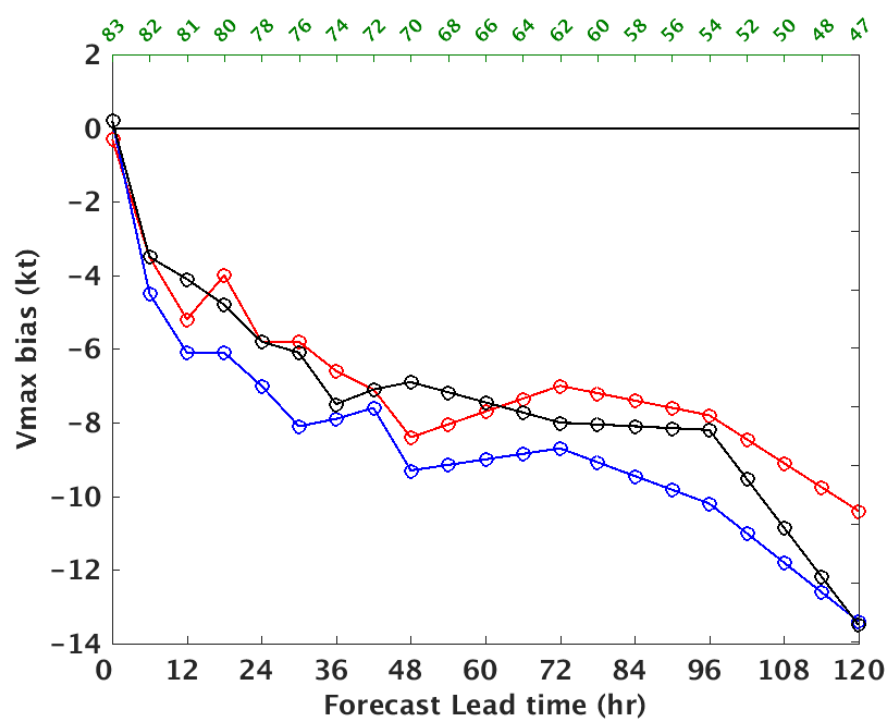
Error bars represent a 95% confidence interval.
 Number of samples used in deriving these statistics is shown in green.

CTRL
AMV1
AMV2

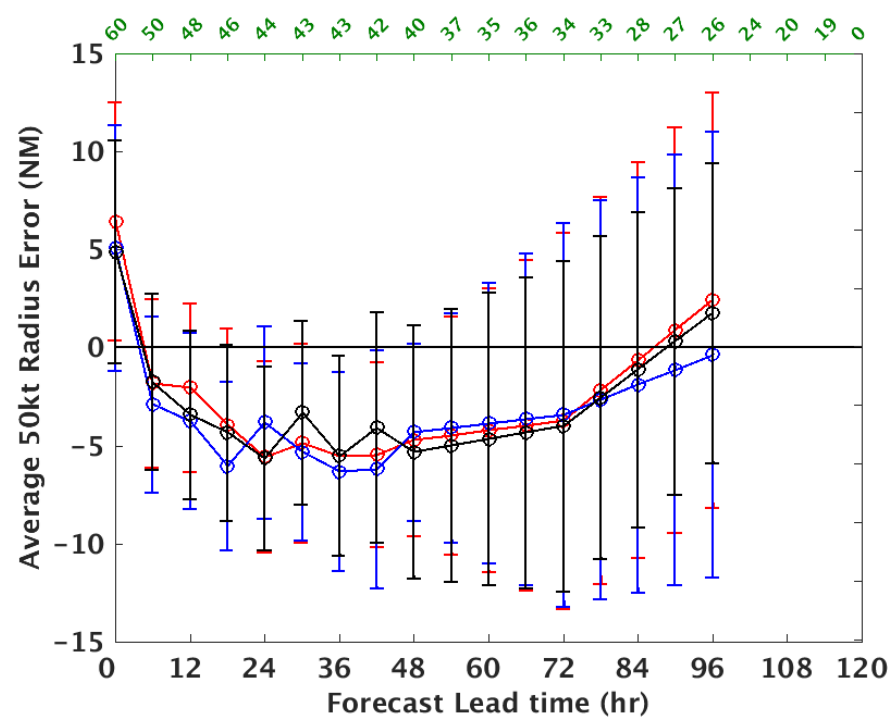
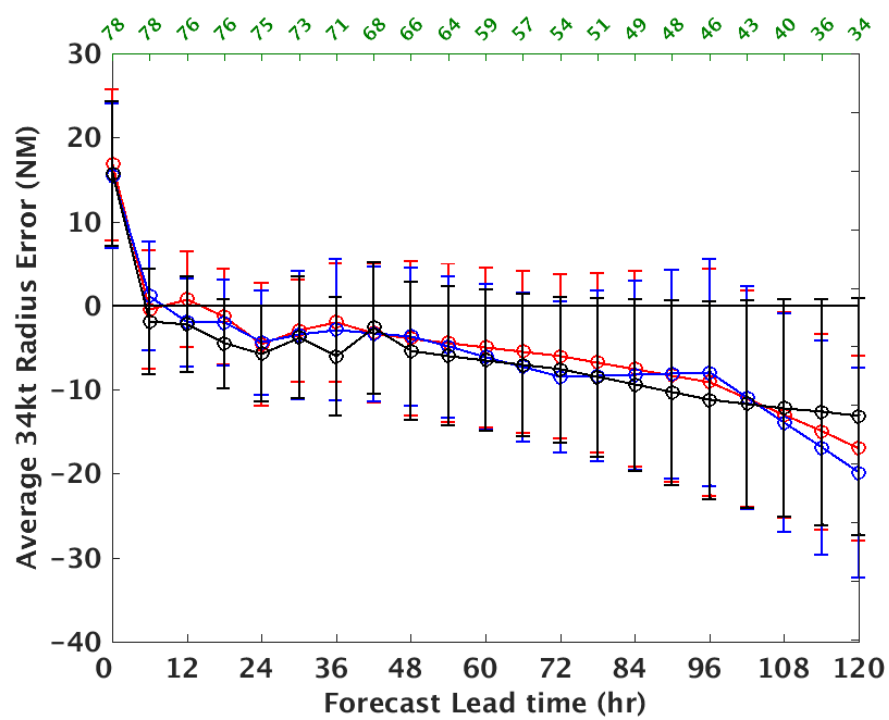




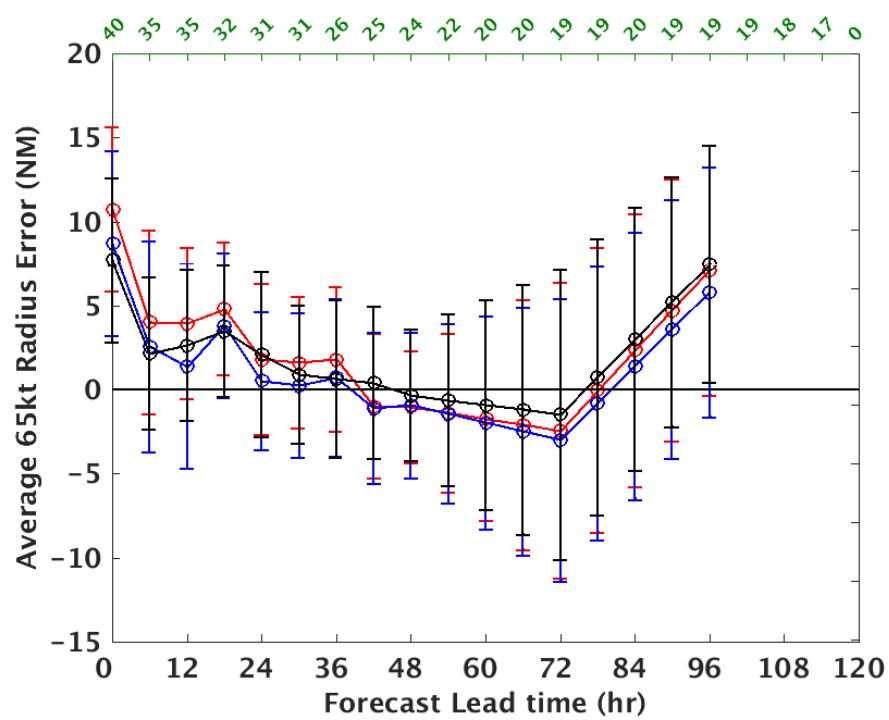
CTRL
AMV1
AMV2



Error bars represent a 95% confidence interval. Number of samples used in deriving these statistics is shown in green.



CTRL
AMV1
AMV2



Error bars represent a 95% confidence interval.
 Number of samples used in deriving these statistics
 is shown in green.

Summary

- Error profiles and QC procedures modified
- Assimilation statistics show no detrimental impact with the addition of AMV types and counts.
- Improvement in forecast track error for all forecast hours
- Slight improvement in intensity metrics for the first 24-36 hours
- Improvement in average 65kt wind radii.

Upcoming Plans

- Run a third long storm for current QC changes to ensure methodology robustness.
- Update model code to H20 when it becomes available.
- Hourly GOES-16 AMVs for 2018 and 2019 storms.

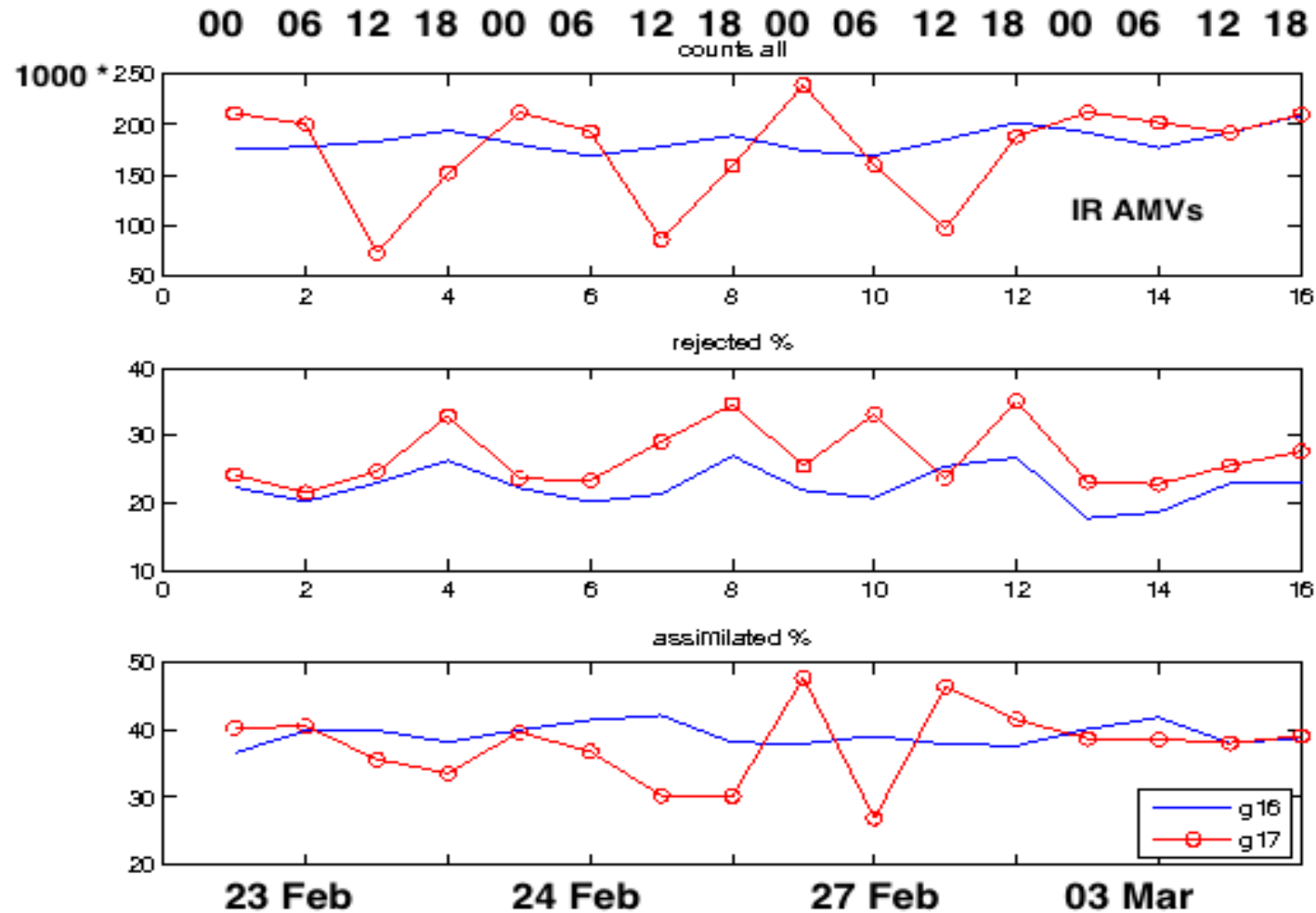
Status on GOES-16 high temporal AMVs and GOES-17 AMVs

- BUFR data for high temporal AMVs
 - Request sent to NCEP Obsproc on **17 May 2019**.
 - NESDIS PDA subscription for CONUS winds for G16/17 submitted on **4 Jun 2019**.
 - Data stream flowing into Obsproc on **18 July 2019**.
 - First 15-min wind sample BUFR for GSI testing because of a switch in BUFR sequence completed on **28 Aug 2019**.
 - In **mid November 2019**
 - Complete review of Obsproc's merger of the hourly data and the 15 min data for files produced routinely. No more hurricane cases to test.
 - Retrospective BUFR files for data in Sept – Oct 2019 showed that the 15 min AMVs were given a different MNEMONIC. This will not allow GSI to read in these AMVs. The 15 min and hourly AMVs should have the same MNEMONIC.
 - Agreement reached to maintain different MNEMONIC for FD and CONUS AMVs on **10 March 2020**. GSI code modification to ingest this data will be needed.
- Hourly GOES-17 AMVs are available starting **8 November 2019 00 UTC**. Testing will start beginning with storms this year. Test BUFR files to include CONUS AMVs request will be sent after Obsproc delivers GOES-16 high temporal AMVs.

Plans for high temporal AMVs and GOES-17 AMVs

- Test QC changes with FD and CONUS AMVs.
- High temporal GOES-16 AMVs for 2019 and 2020 storms.
- GOES-17 AMVs evaluation using GOES-16 experiment setup
- GOES-17 AMVs for 2020 storms.

GOES-17 Band 14 (11um) AMV Metrics in NCEP's GSI



The cyclical drop in GOES-17 Band 14 AMV counts due to GOES-17 Loop Heat Pipe (LHP) anomaly.

Figure courtesy of Iliana Genkova (NCEP GSI global team)

Backup Slides

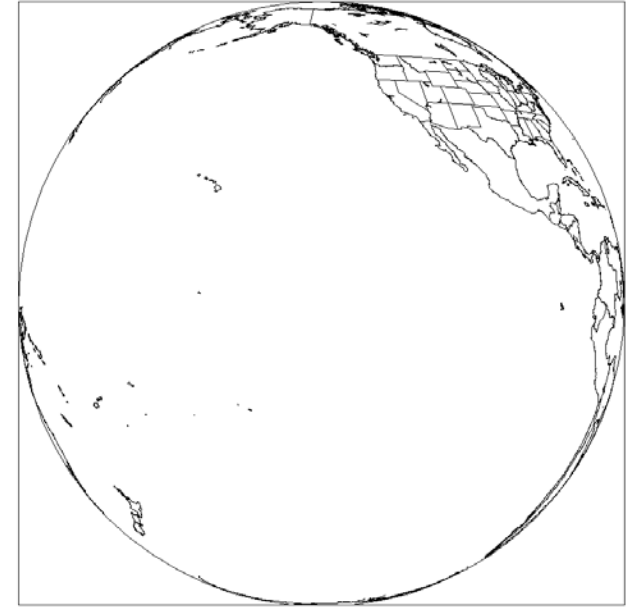
Overview of GOES-16/17

- **FD** (Full disk) images
 - Every 10 minutes
- **CONUS** (Continental US coverage)
 - Every 5 minutes
- 2 meso domains every minute (or 1 domain every 30 seconds)

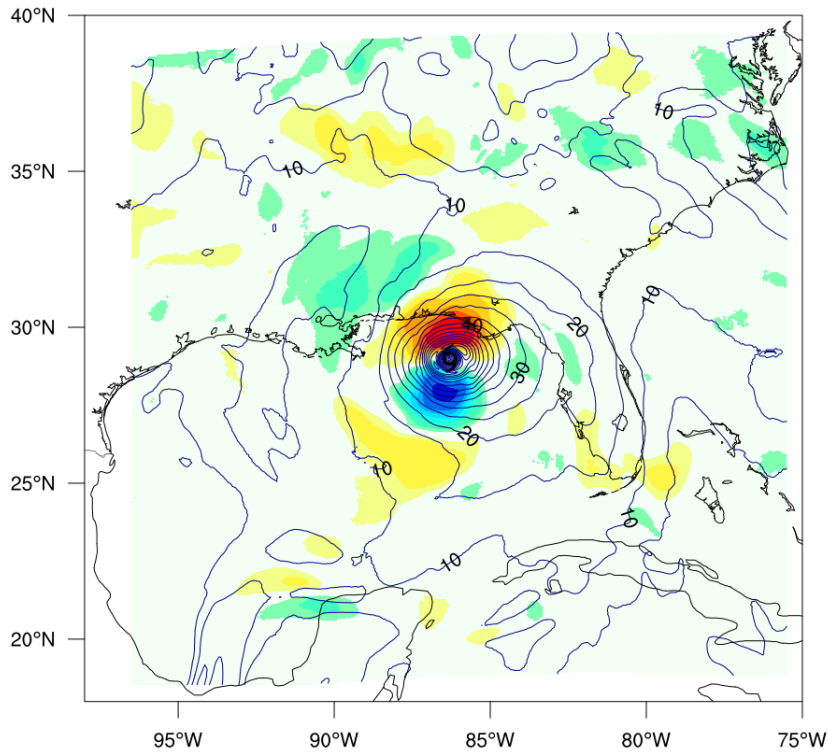
GOES-East (GOES-16)



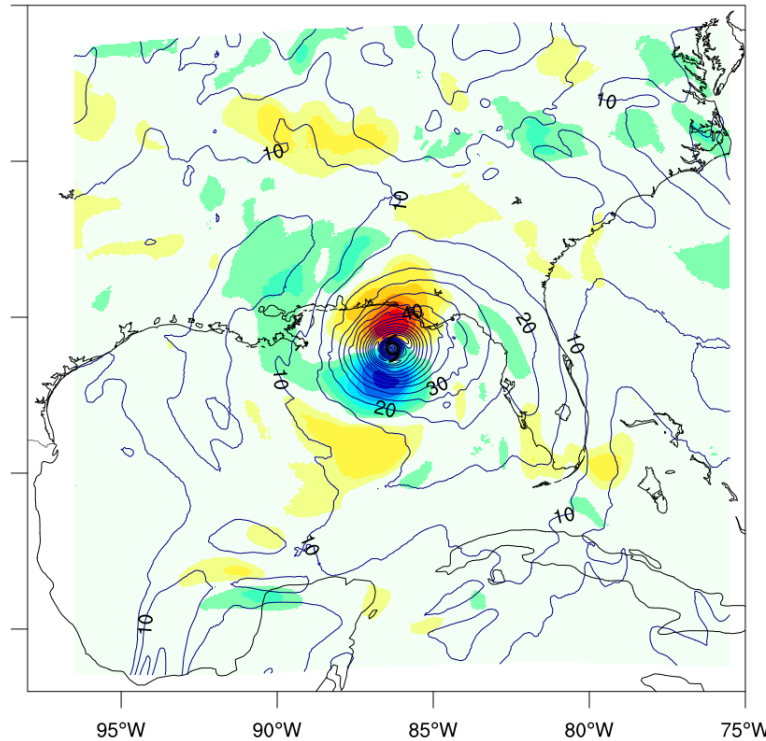
GOES-West (GOES-17)



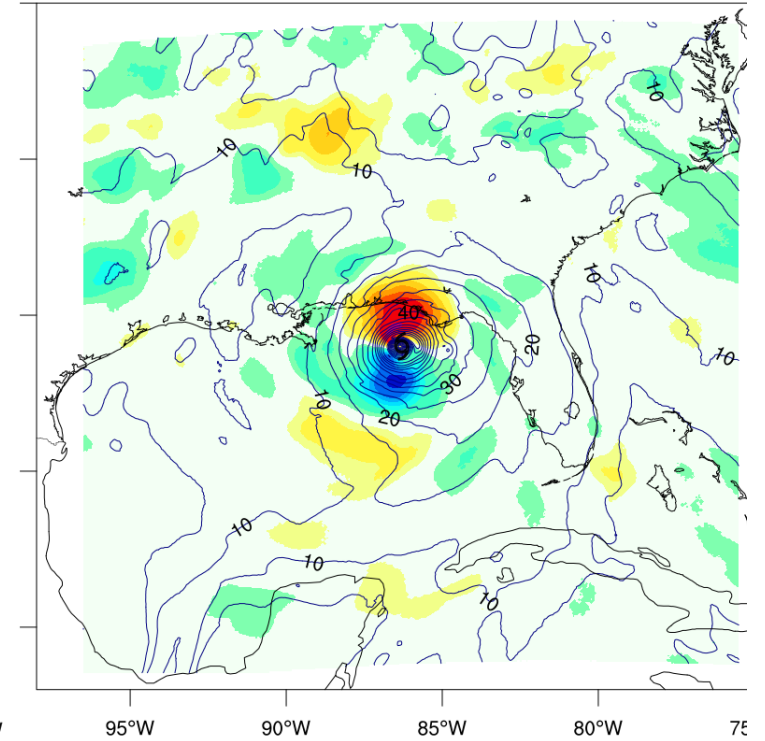
850hPa first guess wind speed and u-wind analysis increment for single cycle (d02)



CTRL



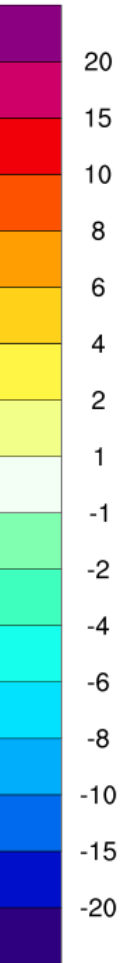
AMV1



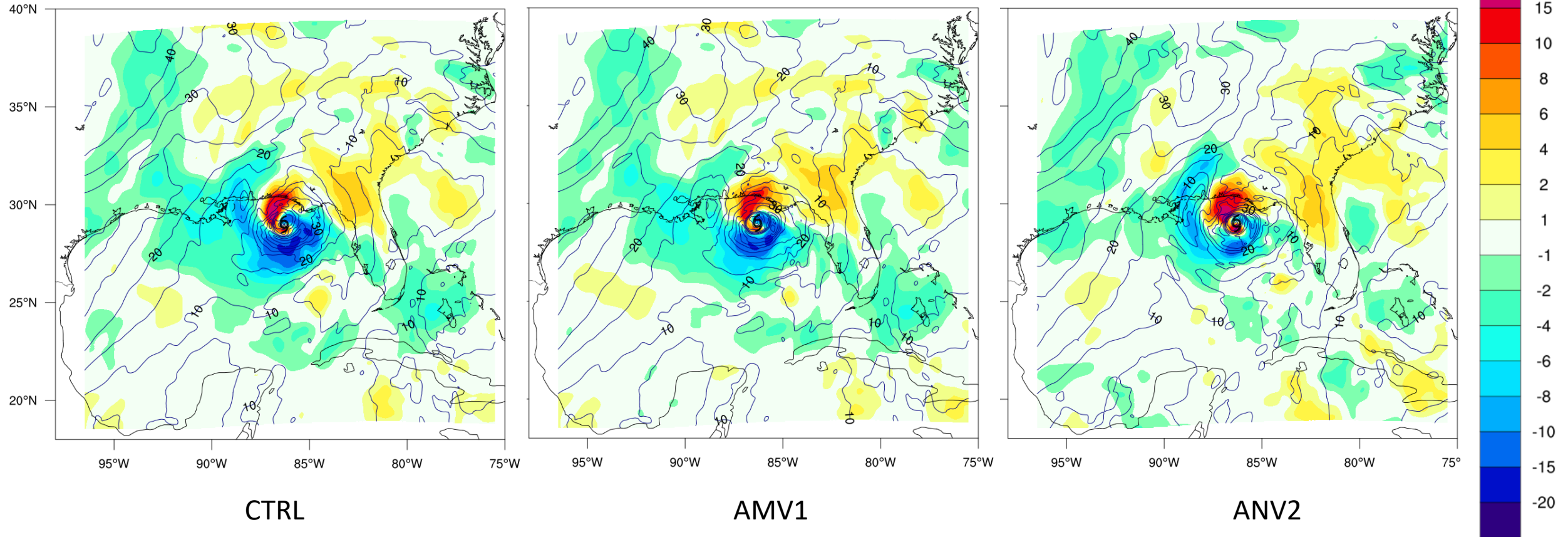
ANV2

First guess – contours
Analysis increments - shaded

CONTOUR FROM -80 TO 80 BY 5



250hPa first guess wind speed and u-wind analysis increment for single cycle (d02)

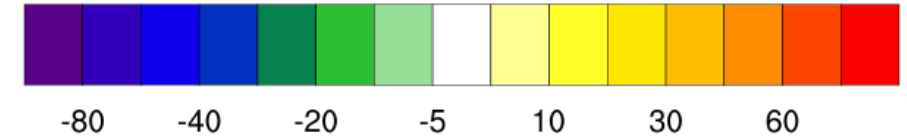


First guess – contours
Analysis increments - shaded

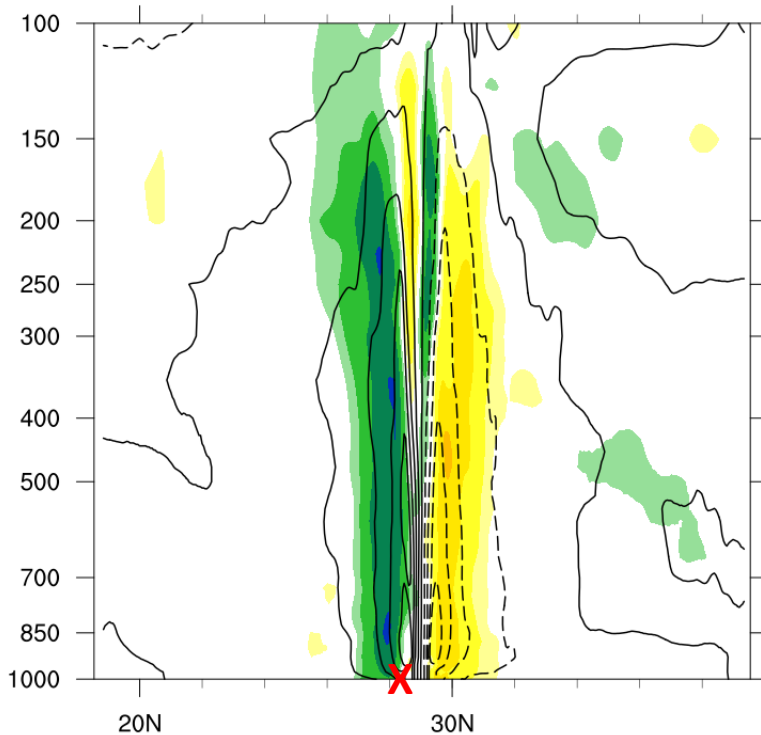
CONTOUR FROM -80 TO 80 BY 5

First guess and analysis increment of u -wind for single cycle (d02)

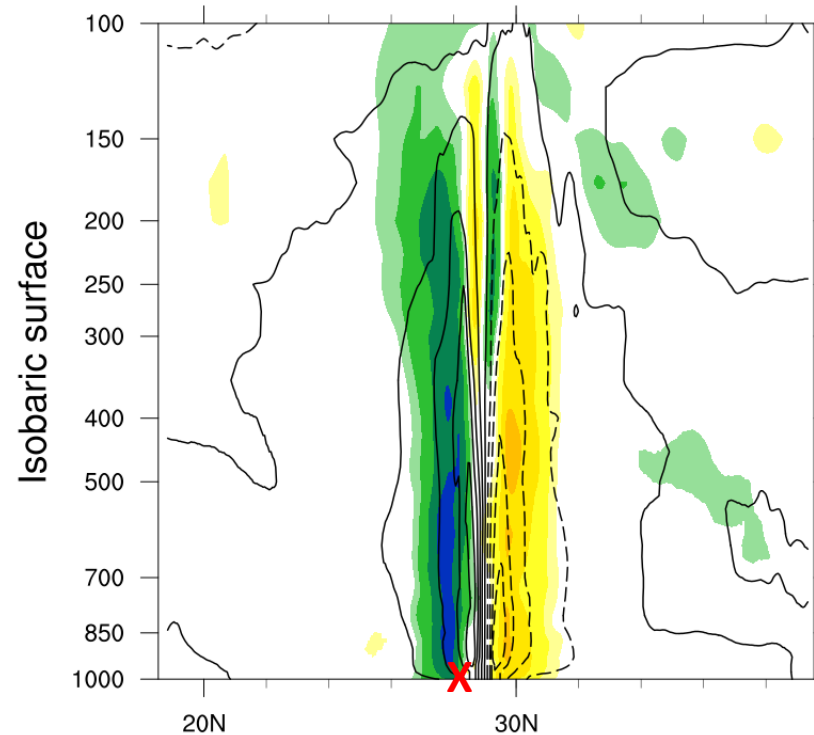
CONTOUR FROM -120 TO 120 BY 30



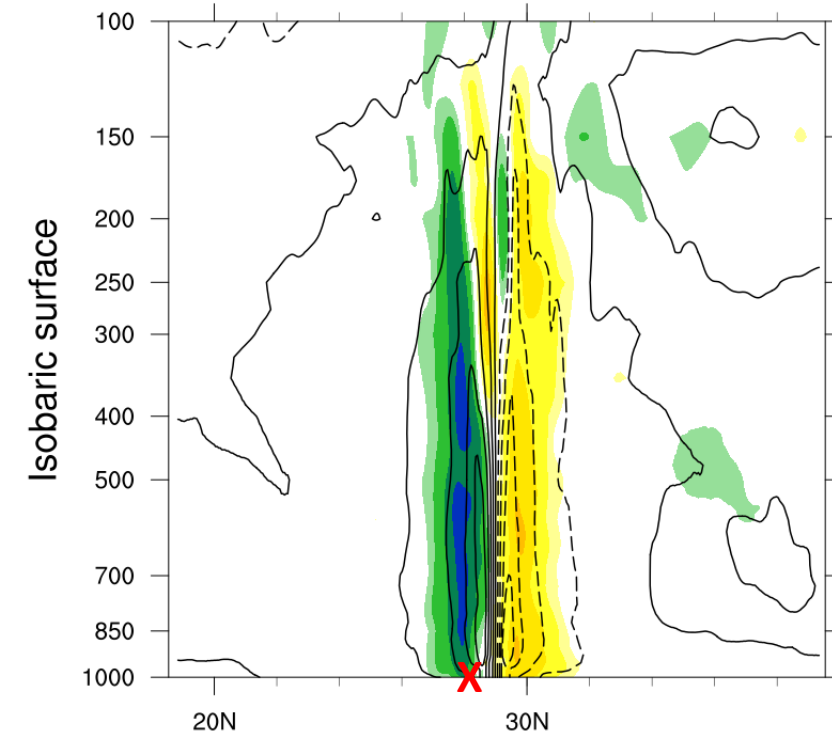
CTRL



AMV1

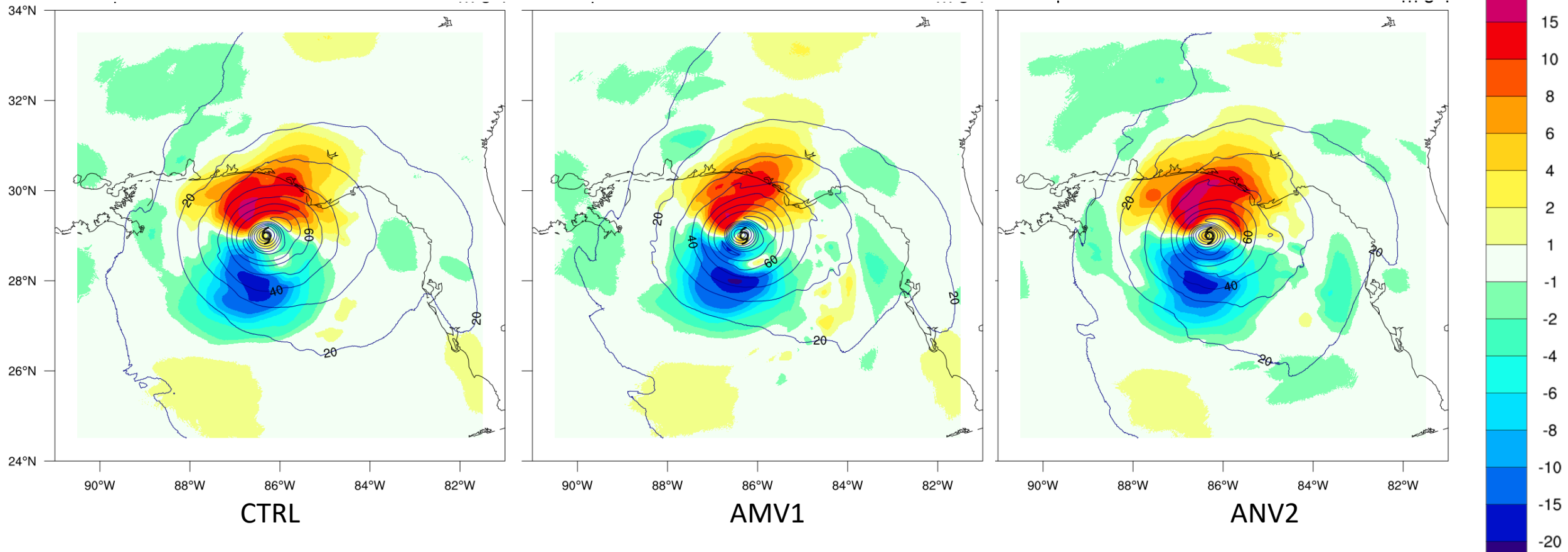


AMV2



First guess (black contours) and analysis increment (color shades) of u -component wind (kt) for 2018101012 cycle of the innermost domain. The cross section was taken through the center of the storm ('X') defined by the NHC best track at 29.0°N, 86.3°W. Dashed contour lines indicate negative u -component wind.

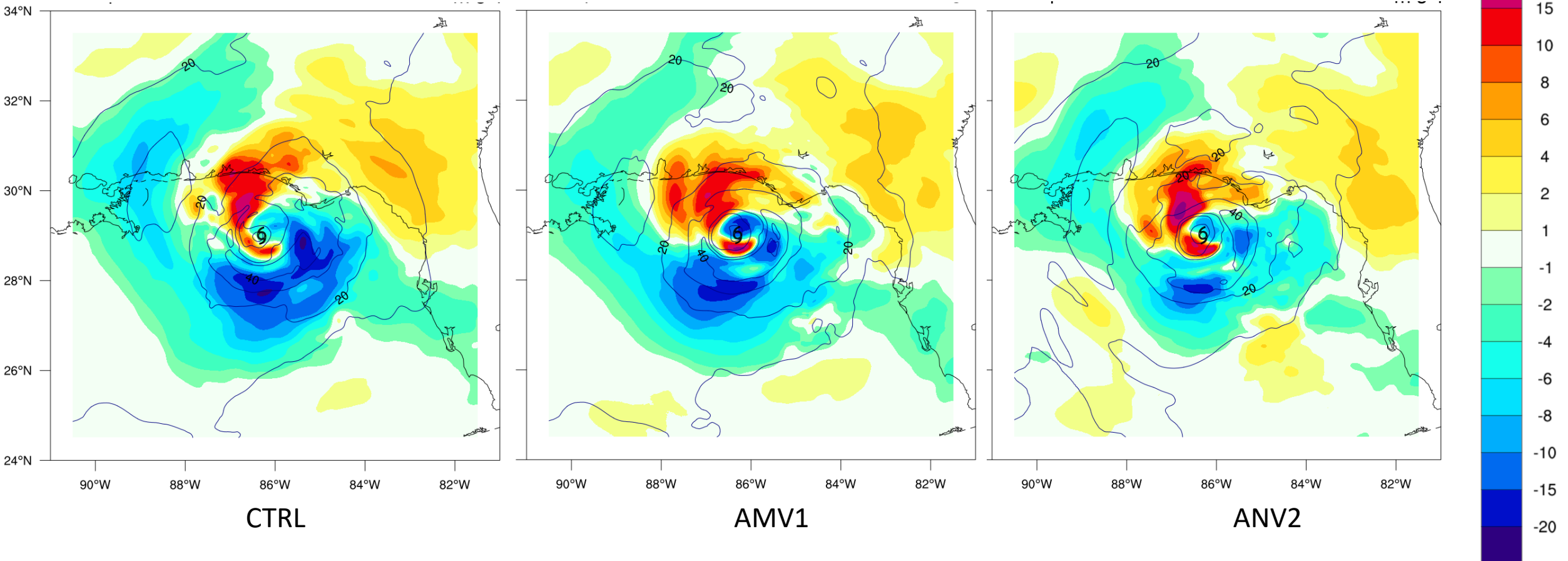
850hPa first guess wind speed and u-wind analysis increment for single cycle (d03)



First guess – contours
Analysis increments - shaded

CONTOUR FROM -80 TO 80 BY 10

250hPa first guess wind speed and u-wind analysis increment for single cycle (d03)

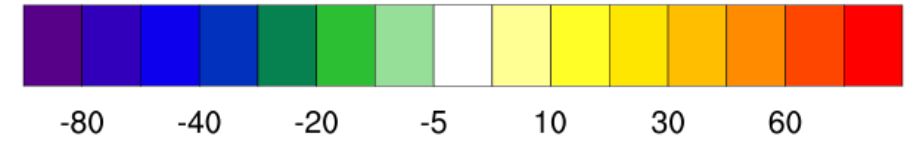


First guess – contours
Analysis increments - shaded

CONTOUR FROM -80 TO 80 BY 10

First guess and analysis increment of u -wind for single cycle (d03)

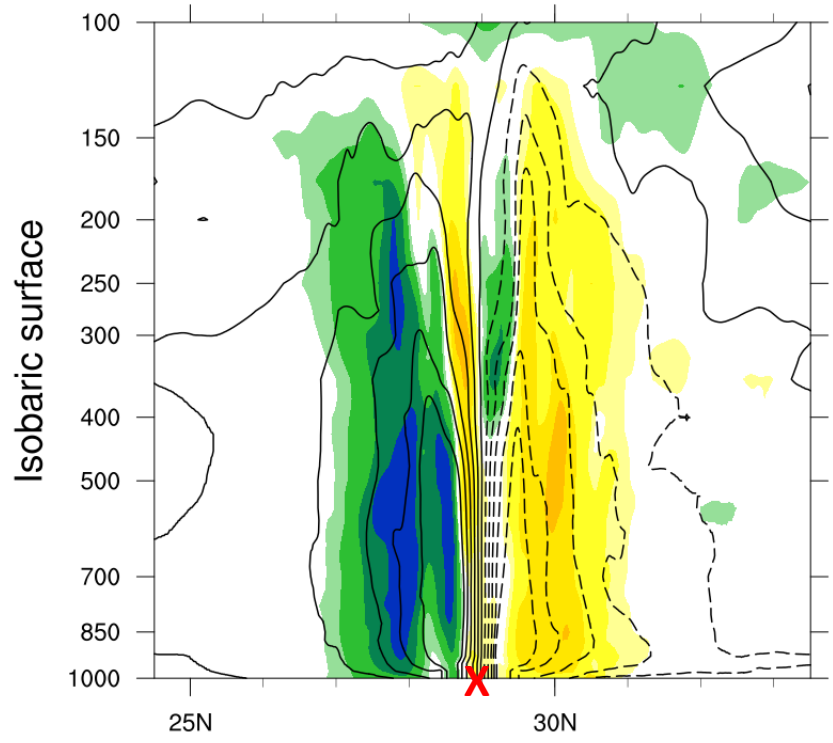
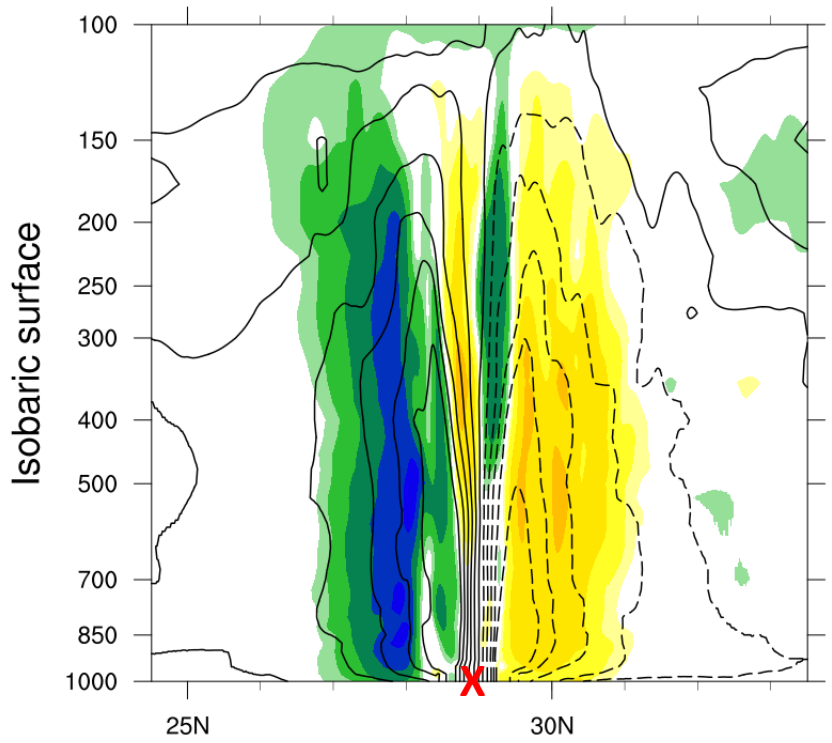
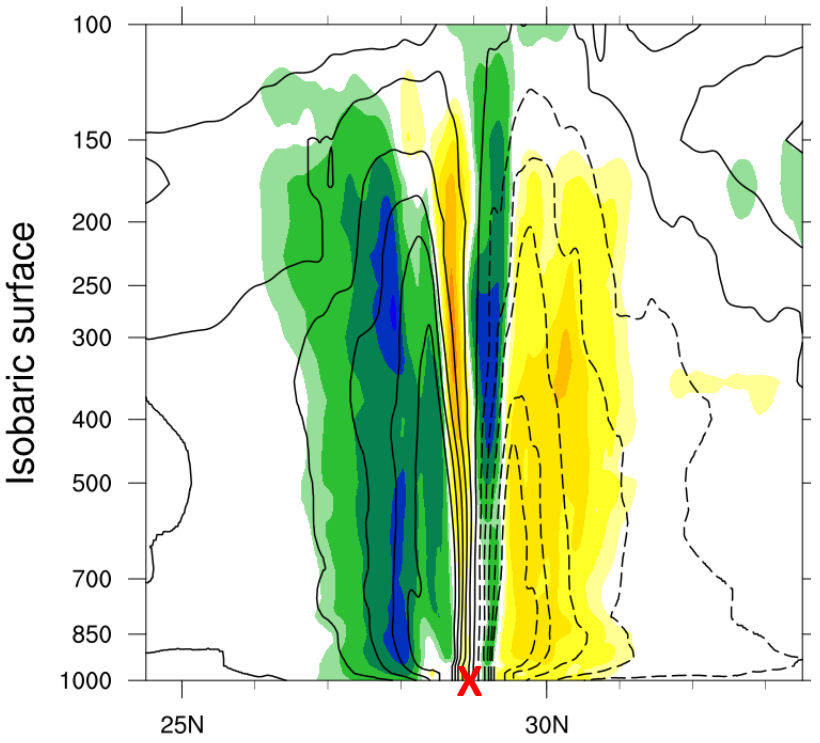
CONTOUR FROM -100 TO 100 BY 20



CTRL

AMV1

AMV2



First guess (black contours) and analysis increment (color shades) of u -component wind (kt) for 2018101012 cycle of the innermost domain. The cross section was taken through the center of the storm ('X') defined by the NHC best track at 29.0°N, 86.3°W. Dashed contour lines indicate negative u -component wind.