

A Systematic Assessment of Dropsonde Impact during the 2017-2019 Hurricane Seasons using the Basin-Scale HWRF: Overall Impacts

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Jason Sippel², Ghassan (Gus) Alaka², Karina Apodaca^{1,2}, & Lidia Cucurull²

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²Hurricane Research Division (HRD) | Atlantic Oceanographic and Meteorological Laboratory (AOML)



Funding: FY18 Hurricane Supplemental | NOAA Award ID #NA19OAR0220188



Project Plan Snapshot

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OBJECTIVE: To conduct a composite study that quantifies the radial impact of dropsondes from manned (C-130, P3, G-IV) and unmanned (GH) aircraft on TC forecasts of track, intensity, and structure over the 2017–2019 hurricane seasons

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Experiment Suite:

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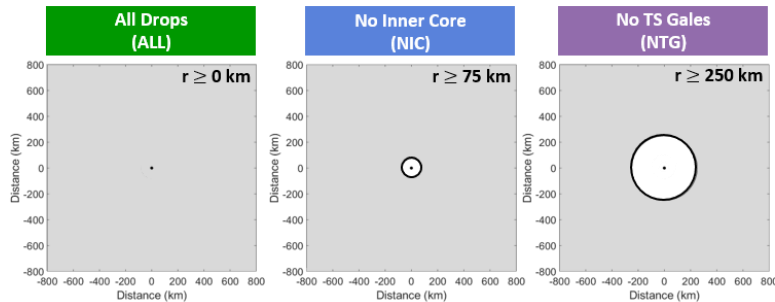
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Dropsondes are allowed outside a given radius (r)



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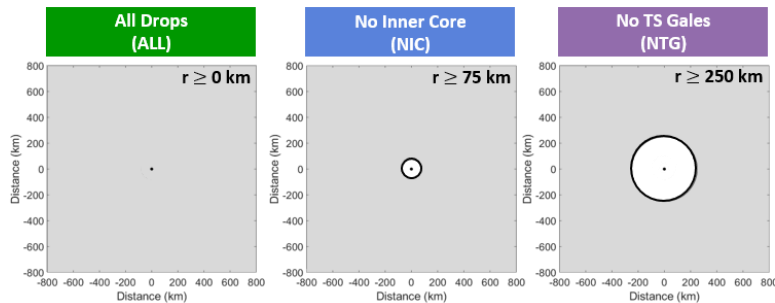
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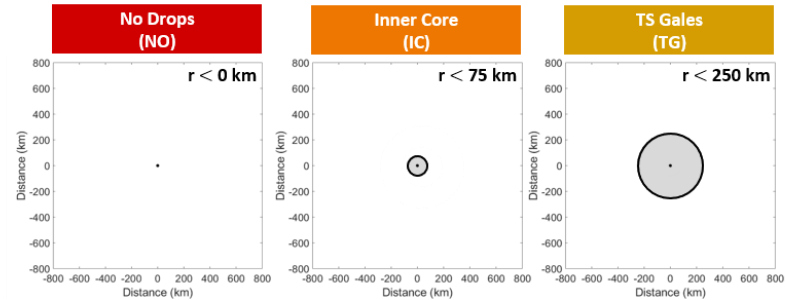
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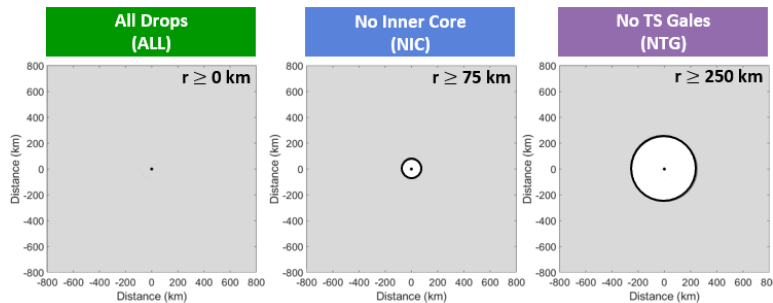
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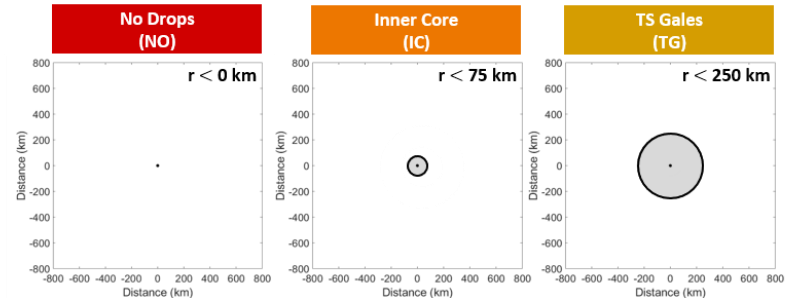
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Scope of Study:

Years	Days	Cycles	$S_{\text{drp}}^*/S_{\text{all}}$
2017-2019	~125	498	22/47

*Storms with assimilated dropsondes

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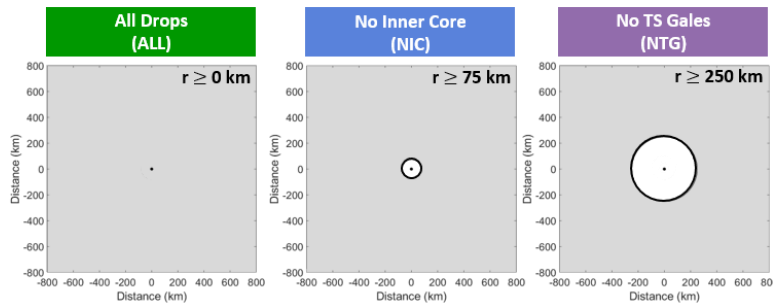
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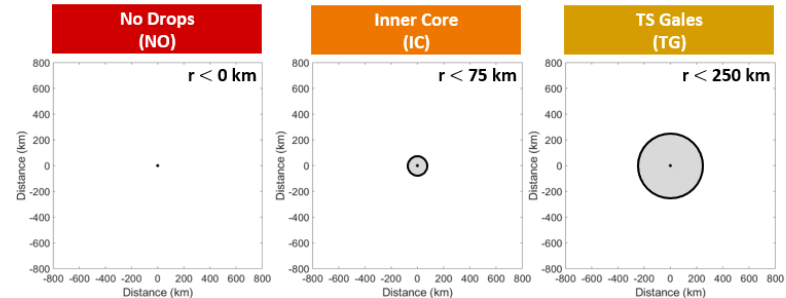
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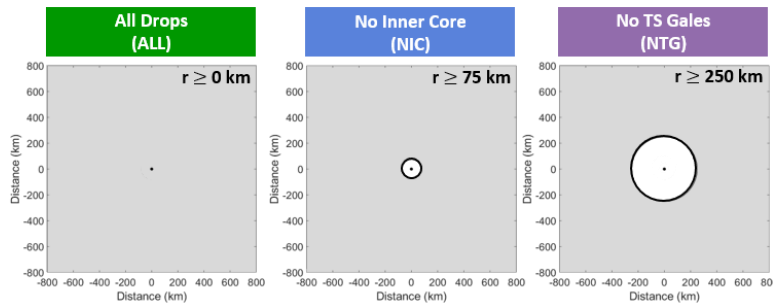
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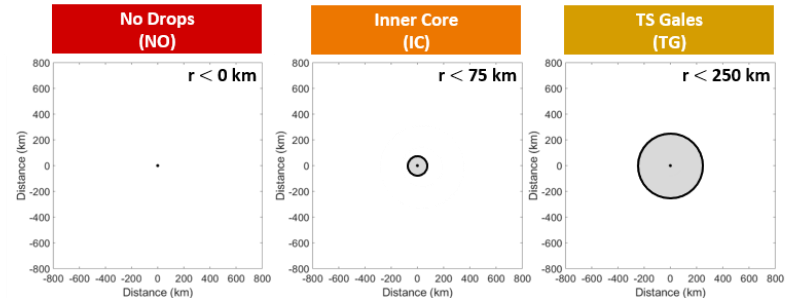
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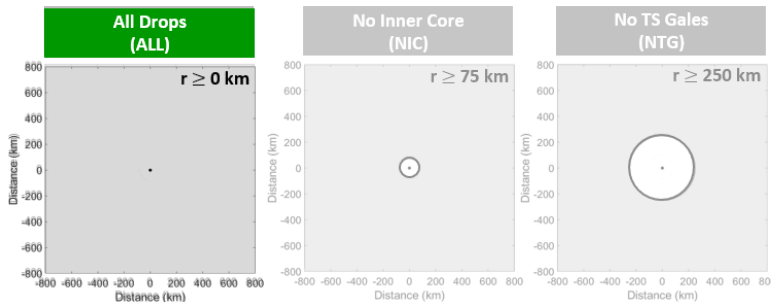
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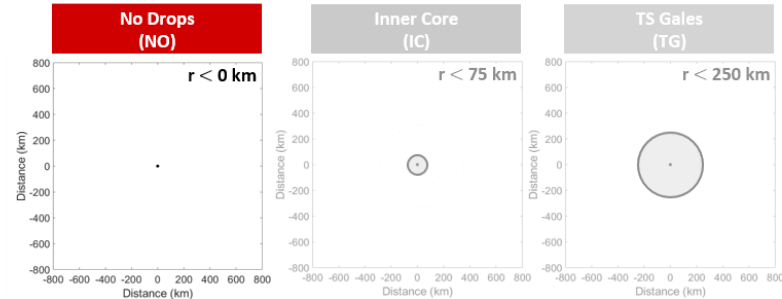
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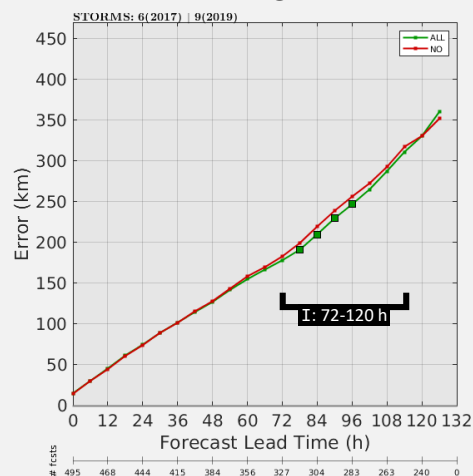
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■ (●): 95% (90%) sig.

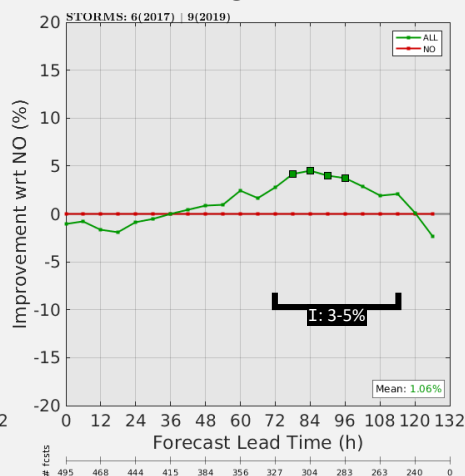
Full* Sample

Basin: AL | Verification: Consistent with NHC

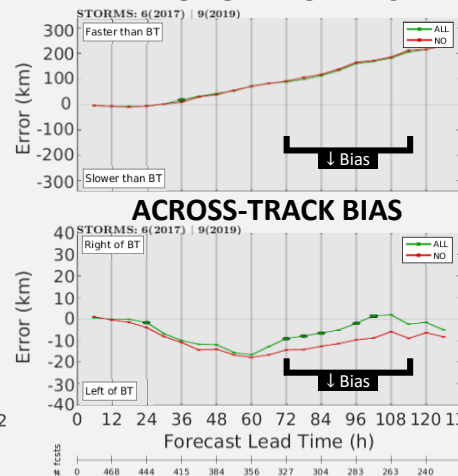
ERROR



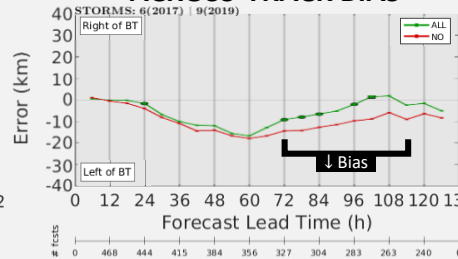
IMPROVEMENT



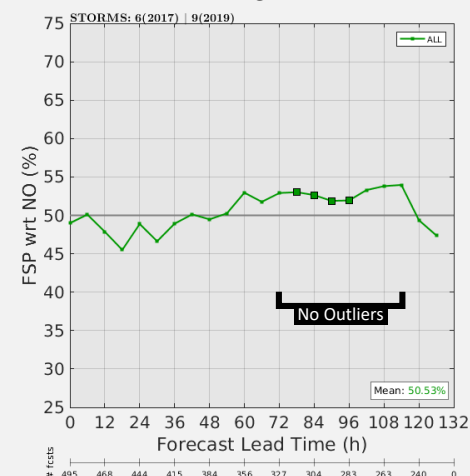
ALONG-TRACK BIAS



ACROSS-TRACK BIAS



FSP

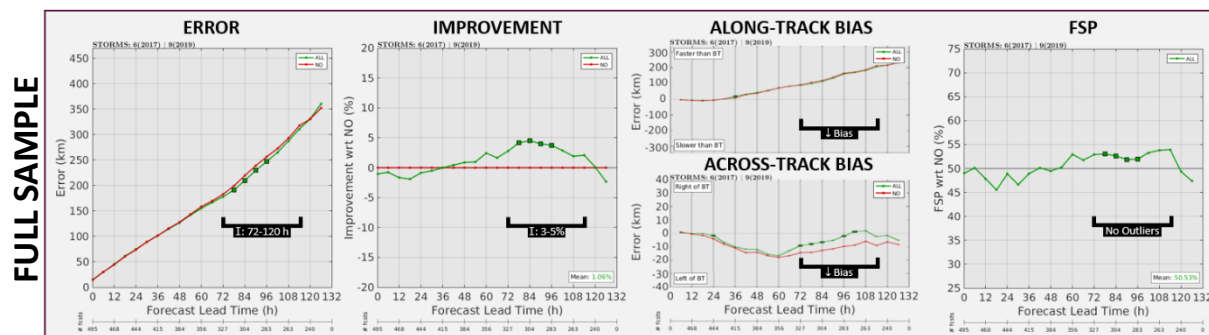


OVERALL ASSESSMENT

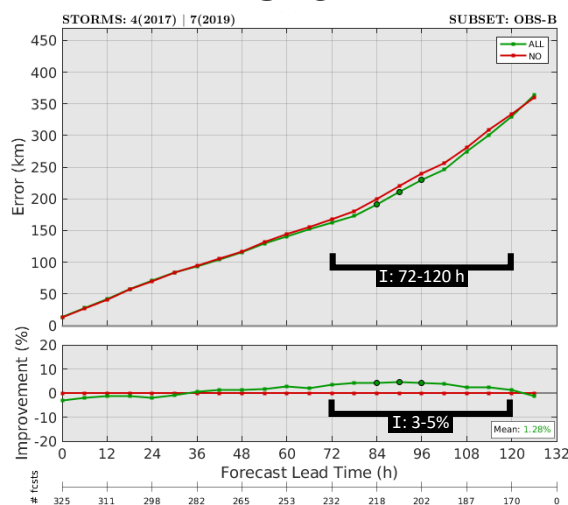
The inclusion of dropsondes improves track forecasts between 72-120 h around 3-5%. Additionally, the assimilation of dropsondes reduces the across-track bias and the improvement found isn't driven by large outliers.

Stratification By Data Availability

Basin: AL | Verification: Consistent with NHC

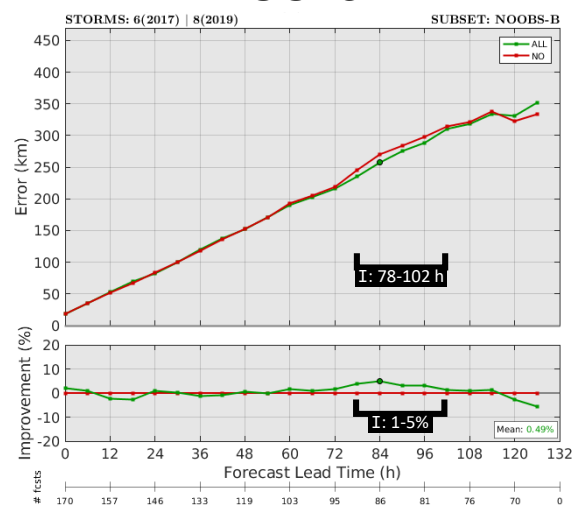


OBS-B



Cycles that did have assimilated
dropsondes in the parent domain

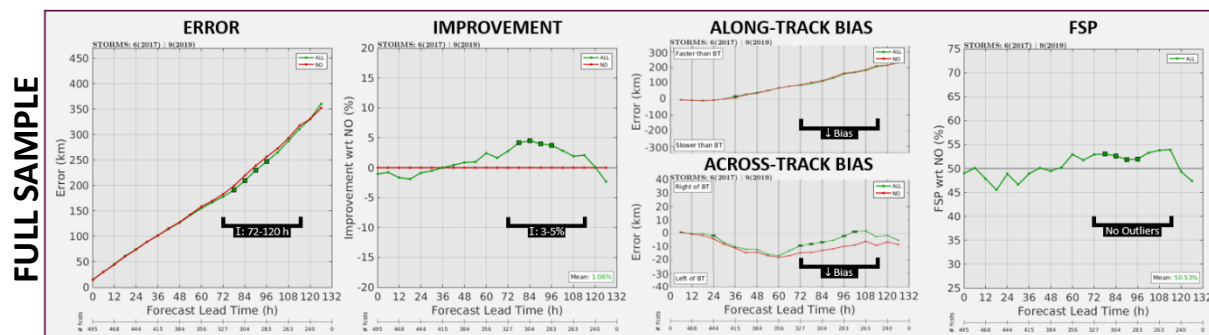
NOOBS-B



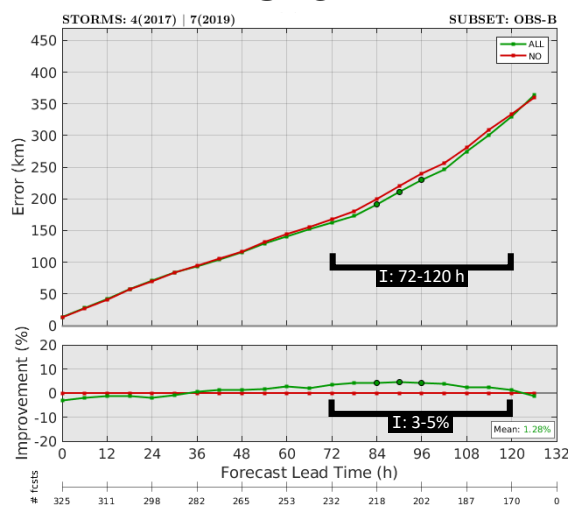
Cycles that did not have assimilated
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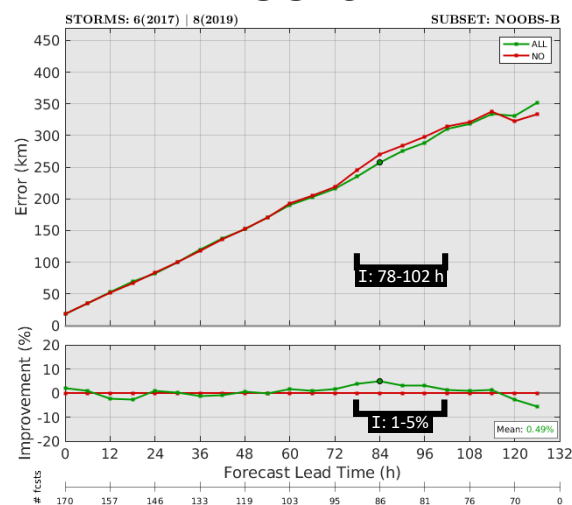
Basin: AL | **Verification:** Consistent with NHC



OBS-B



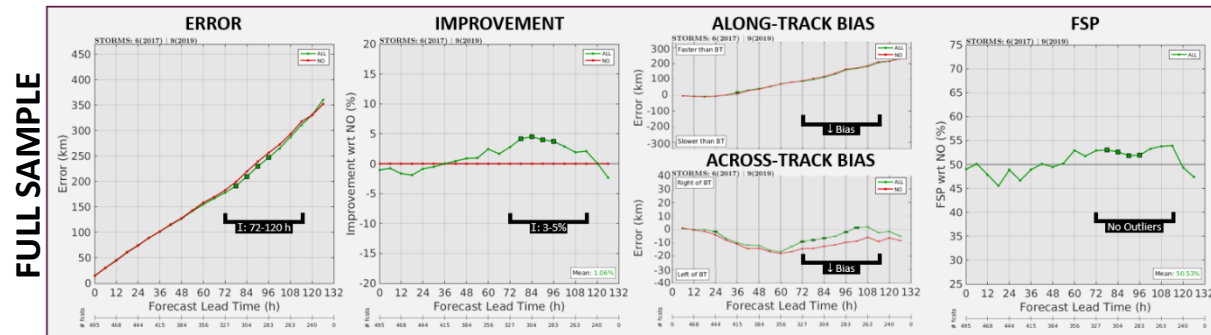
NOOBS-B



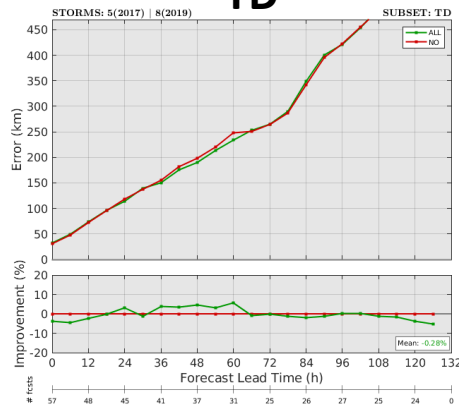
This indicates that cycles with dropsondes in the parent domain (OBS-B) outperformed those cycles without dropsondes in the parent domain (NOOBS-B). Not shown is that cycles from storms with dropsondes showed 5-6% improvement between 72-120 h.

Stratification By Intensity

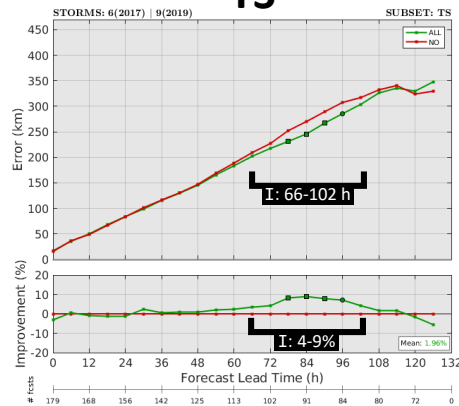
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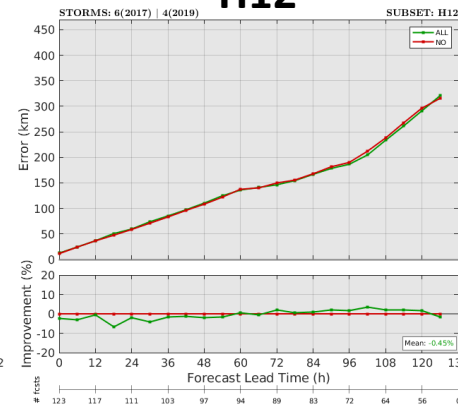
TD



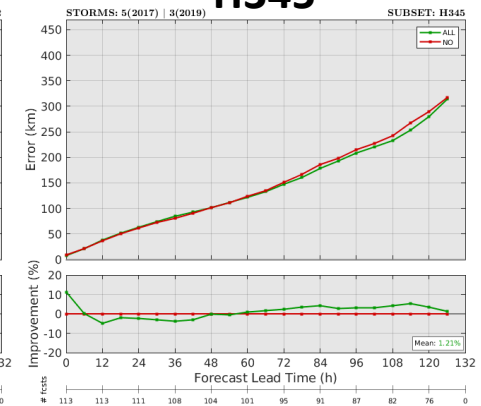
TS



H12

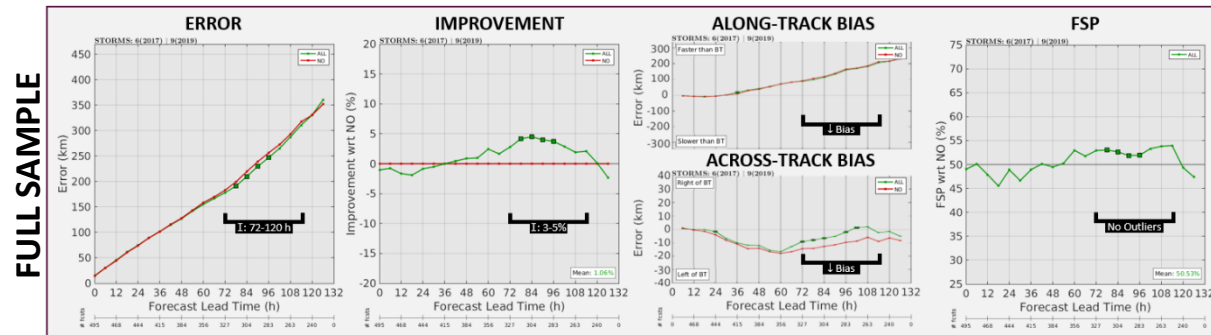


H345

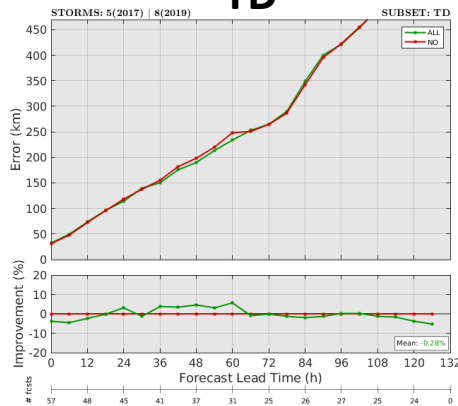


Stratification By Intensity

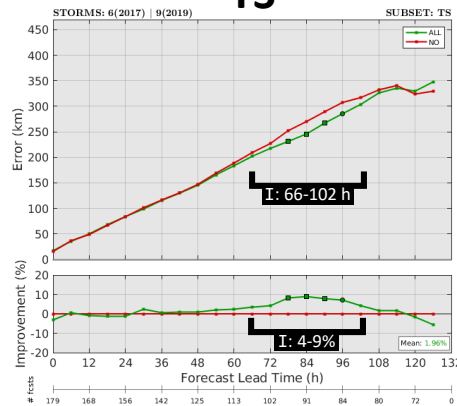
Basin: AL | **Verification:** Consistent with NHC



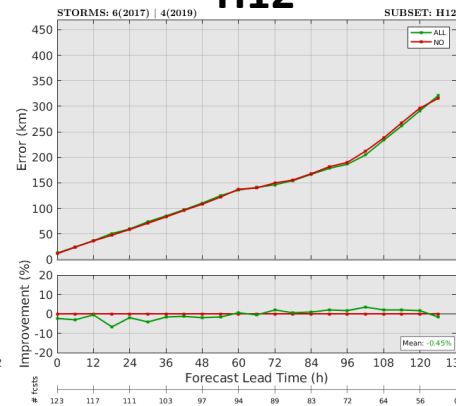
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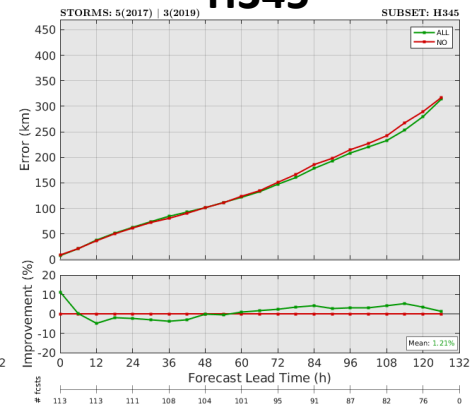
TS



H12



H345



Cycles from storms of TS intensity drove track improvement, with 4-9% track improvement between 66-102 h.

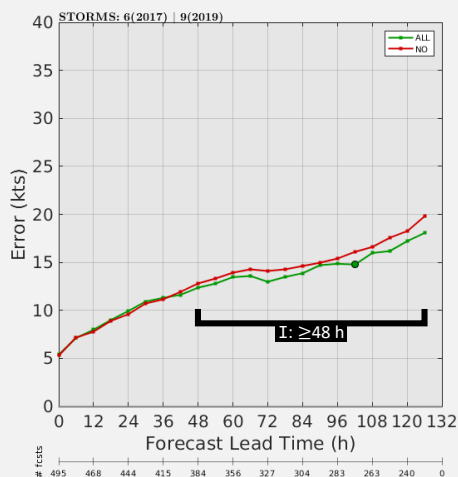
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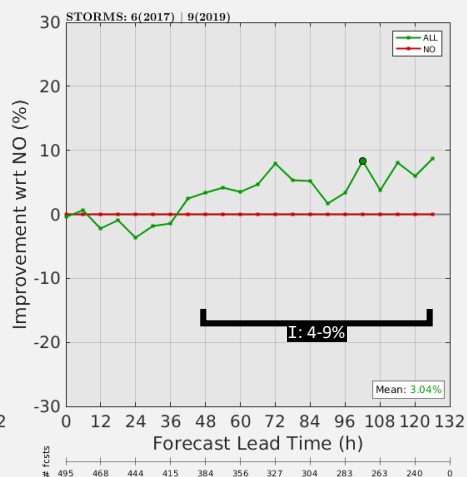
Full* Sample

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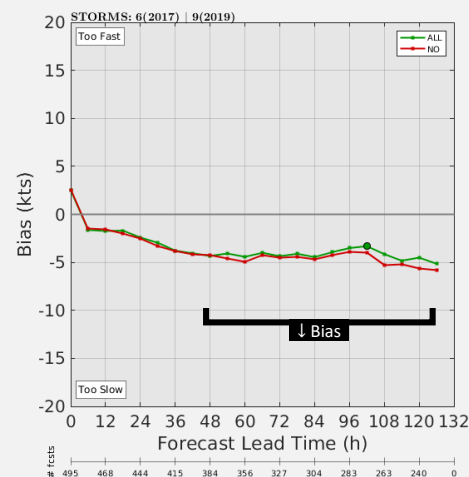
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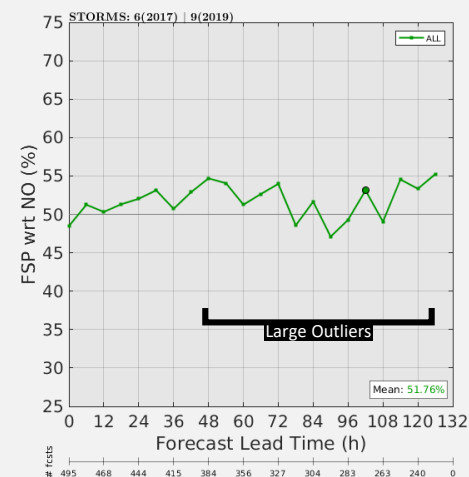
IMPROVEMENT



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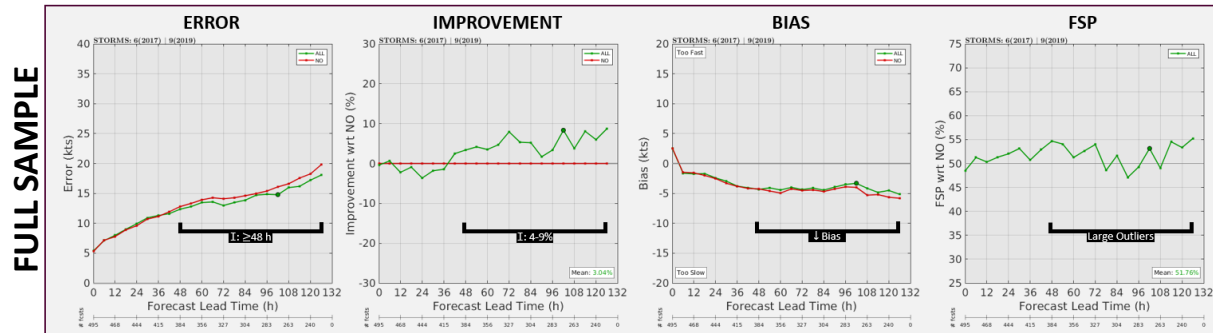


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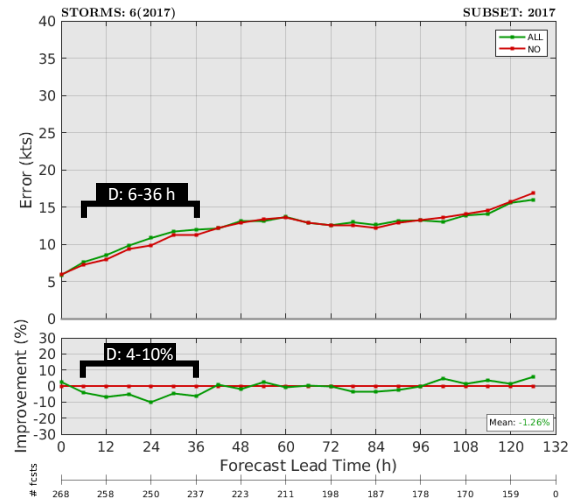
The inclusion of dropsondes improves wind speed forecasts ≥ 48 h around 4-9%. Additionally, the assimilation of dropsondes slightly reduces the bias and the improvement found is driven by some large outliers.

Stratification By Year

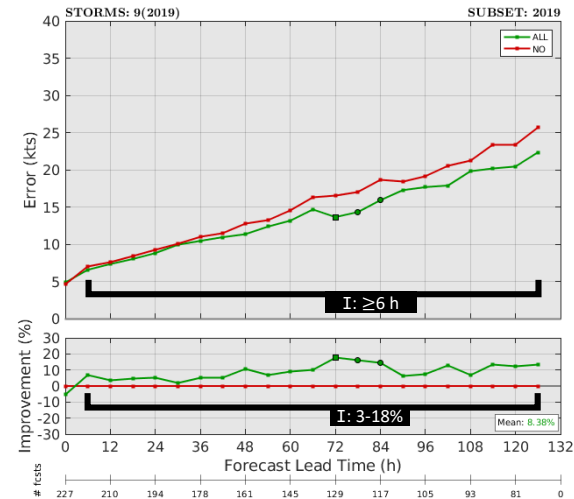
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2017

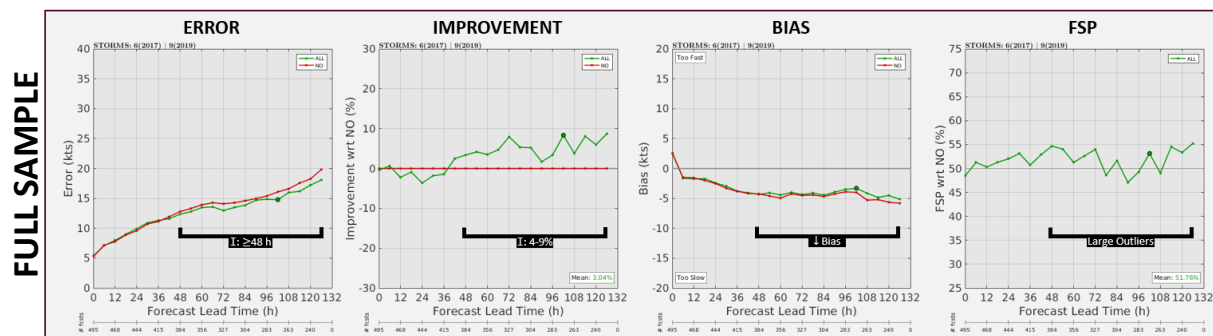


2019

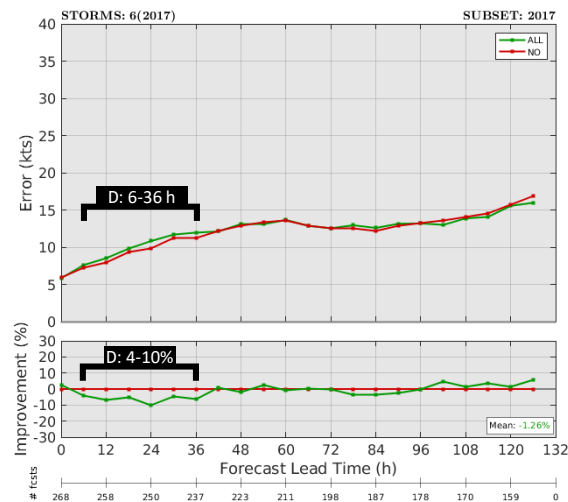


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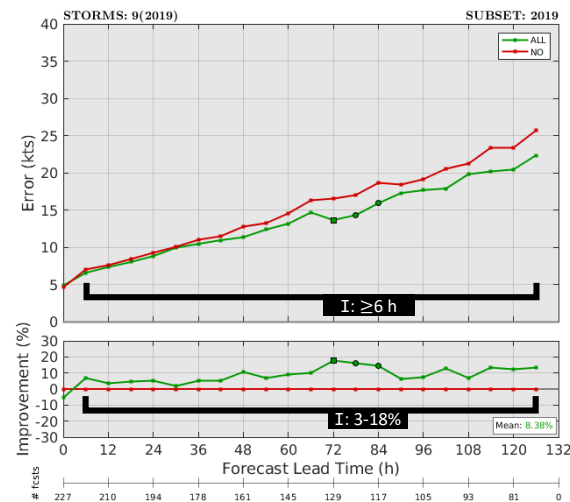
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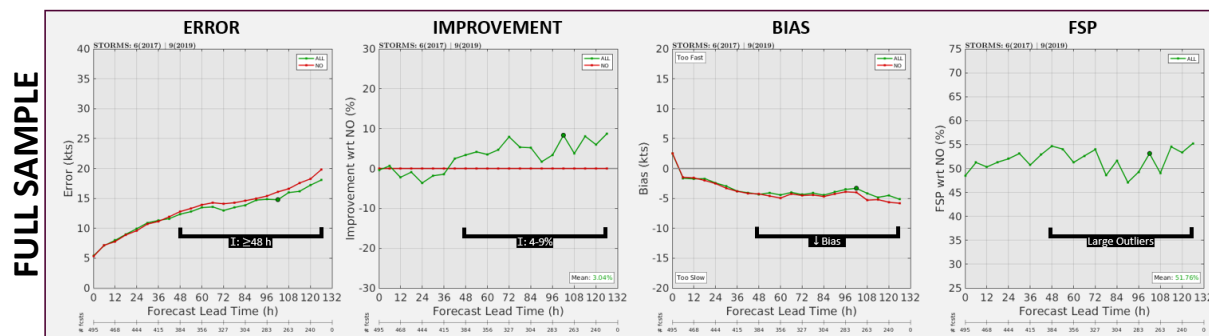
2019



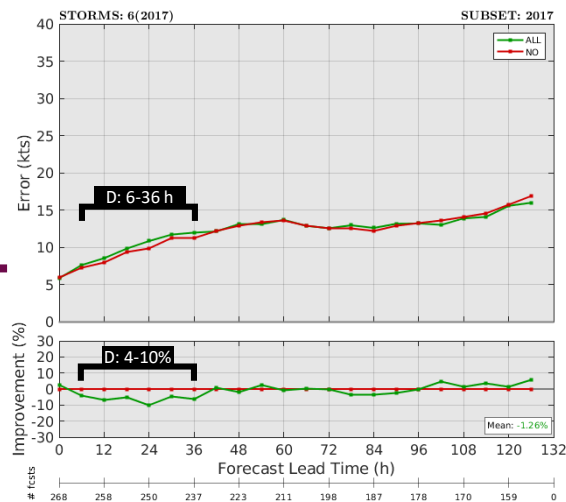
Between 2017 and 2019 there was a change to the observing system method – end-point dropsondes and an inner circumnavigation were both added. Could this be driving the interannual difference shown?

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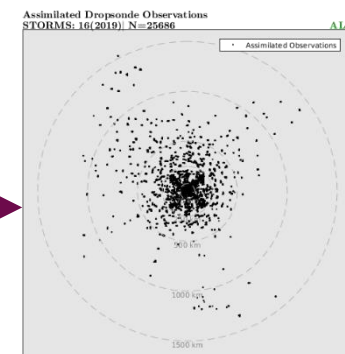
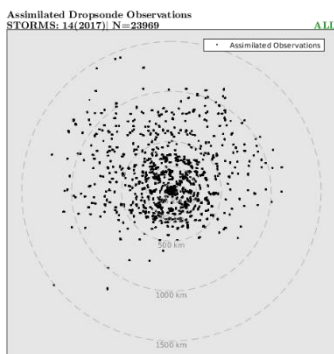
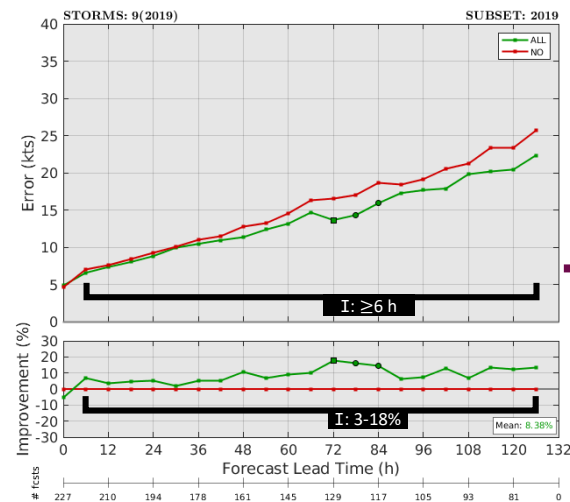
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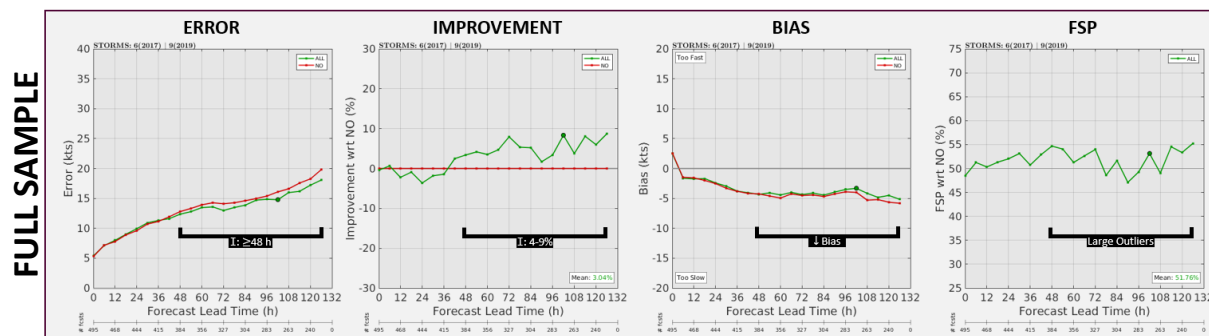
2019



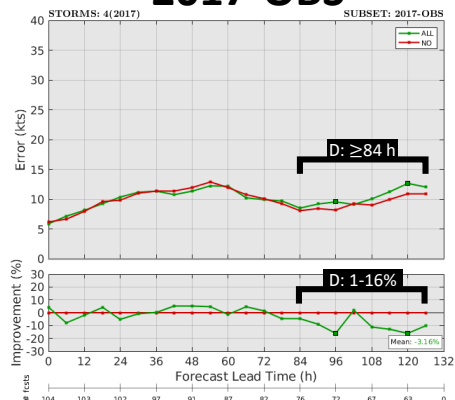
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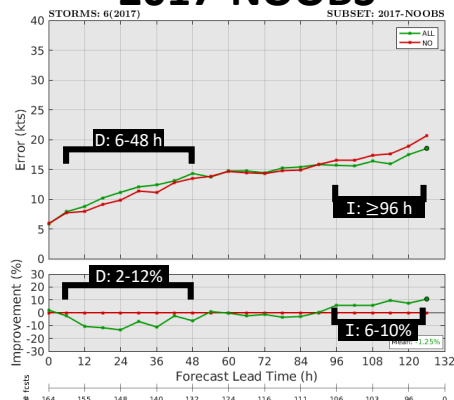


2017-OBS



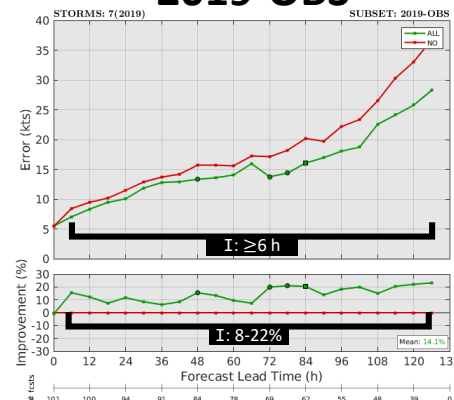
Cycles from 2017 storms that did directly assimilate dropsondes

2017-NOOBS



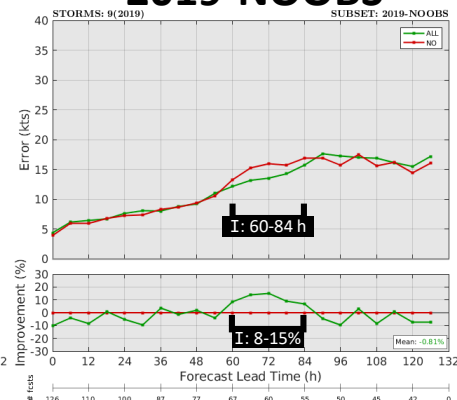
Cycles from 2017 storms that did not directly assimilate dropsondes

2019-OBS



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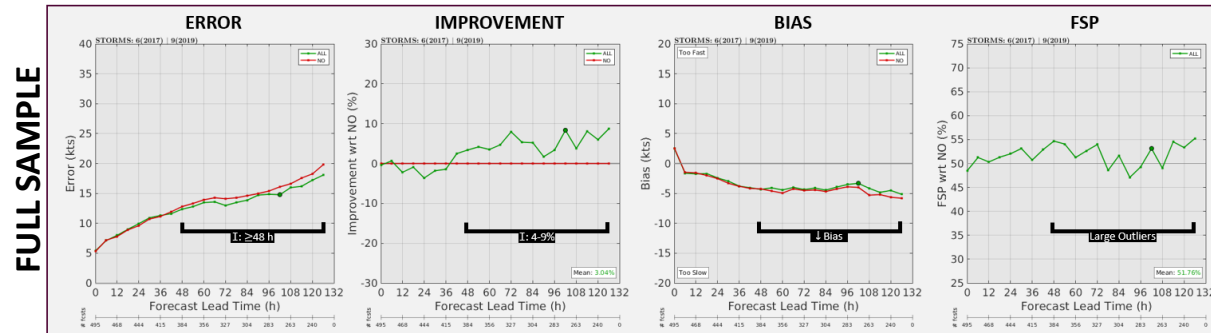
2019-NOOBS



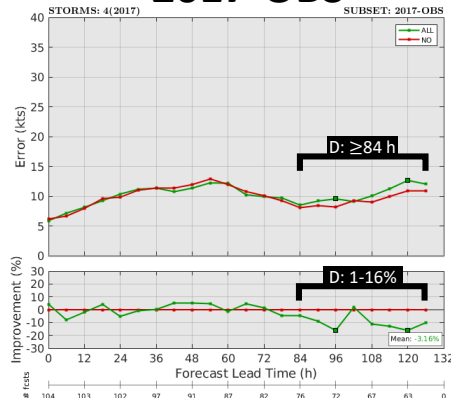
Cycles from 2019 storms that did not directly assimilate dropsondes

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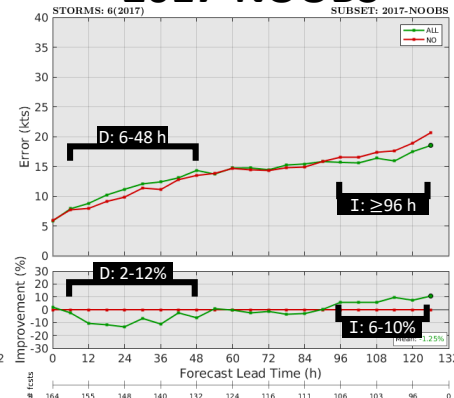
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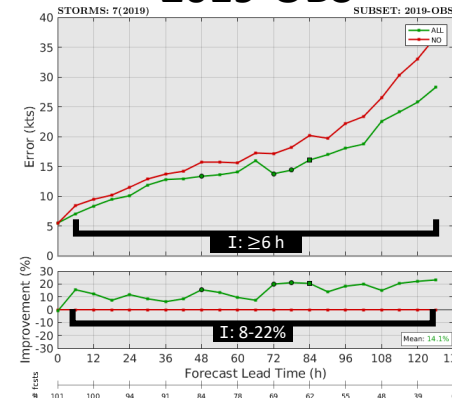
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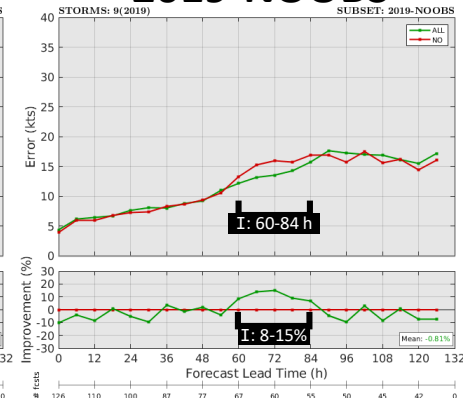
2017-NOOBS



2019-OBS



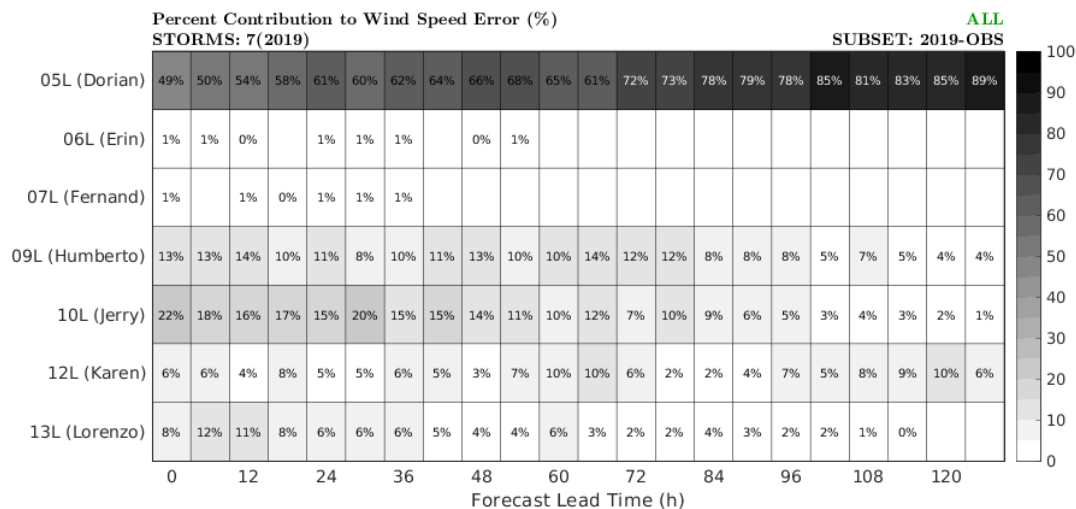
2019-NOOBS



This indicates that cycles from storms with dropsondes in 2019 (2019-OBS) drove wind speed improvement in the full sample.

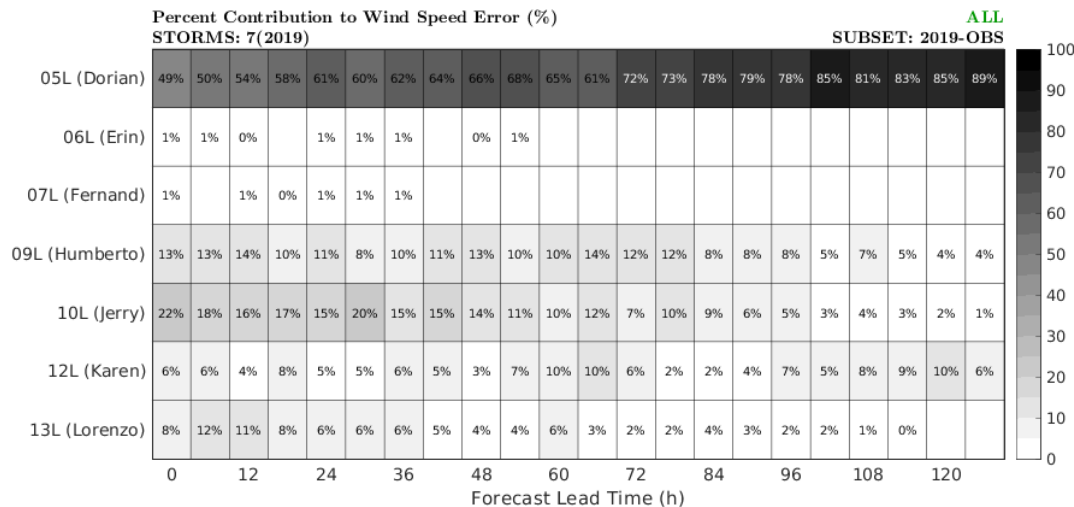
Assessment of 2019-OBS Performance

Individual Storm Contribution

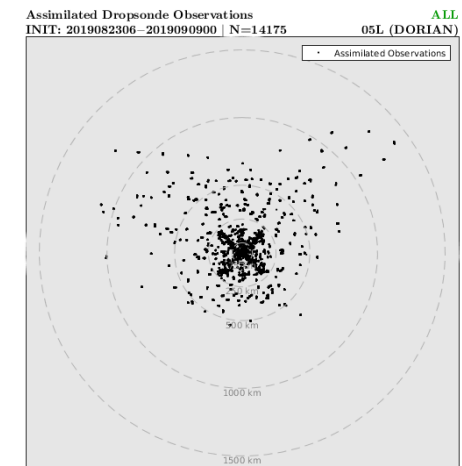


Assessment of 2019-OBS Performance

Individual Storm Contribution

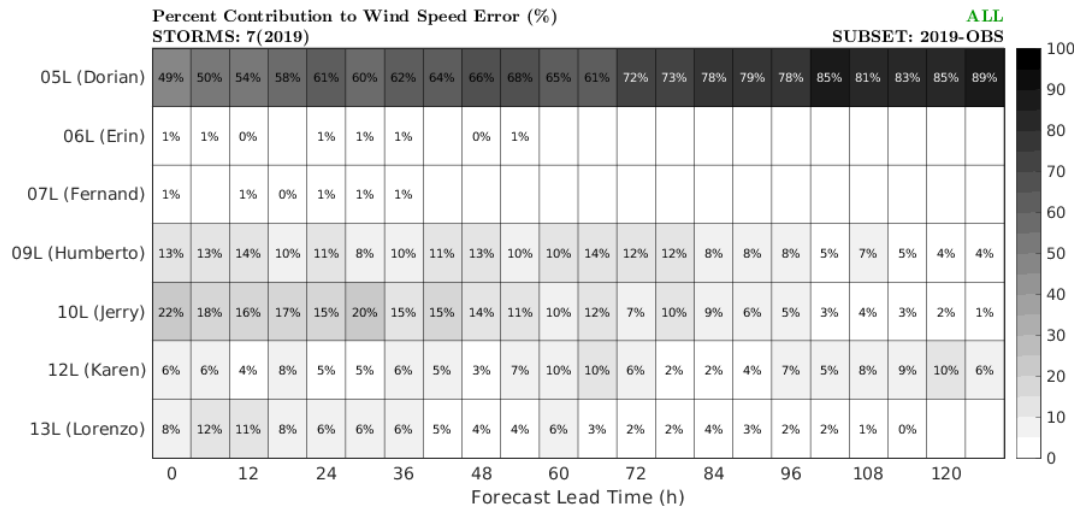


Dorian's Dropsonde Distribution

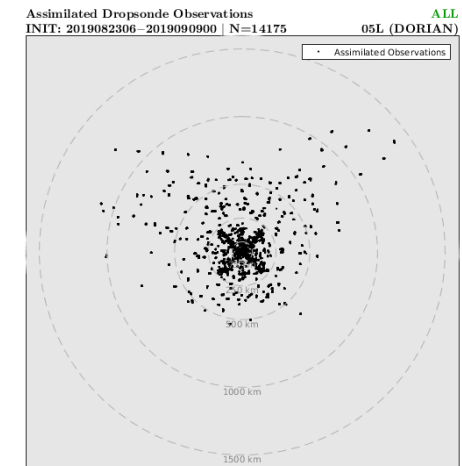


Assessment of 2019-OBS Performance

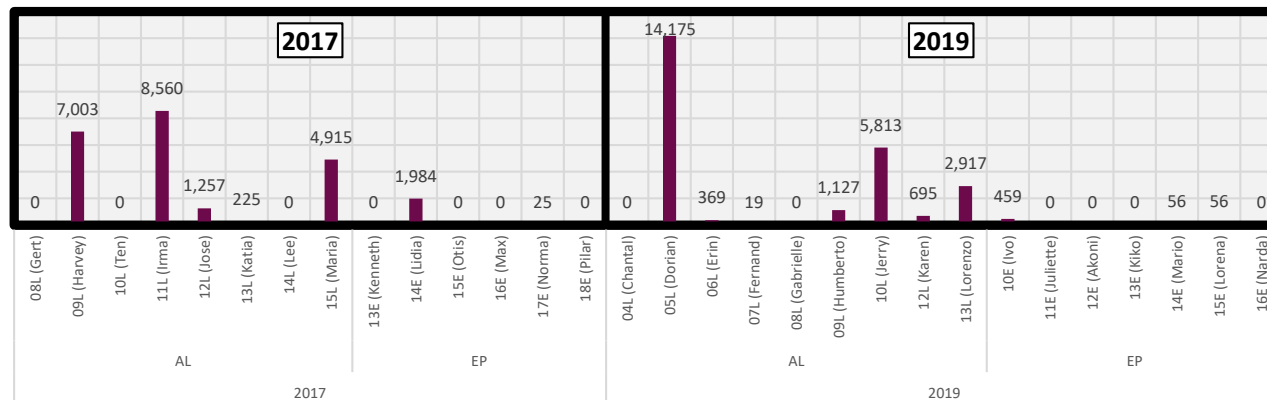
Individual Storm Contribution



Dorian's Dropsonde Distribution

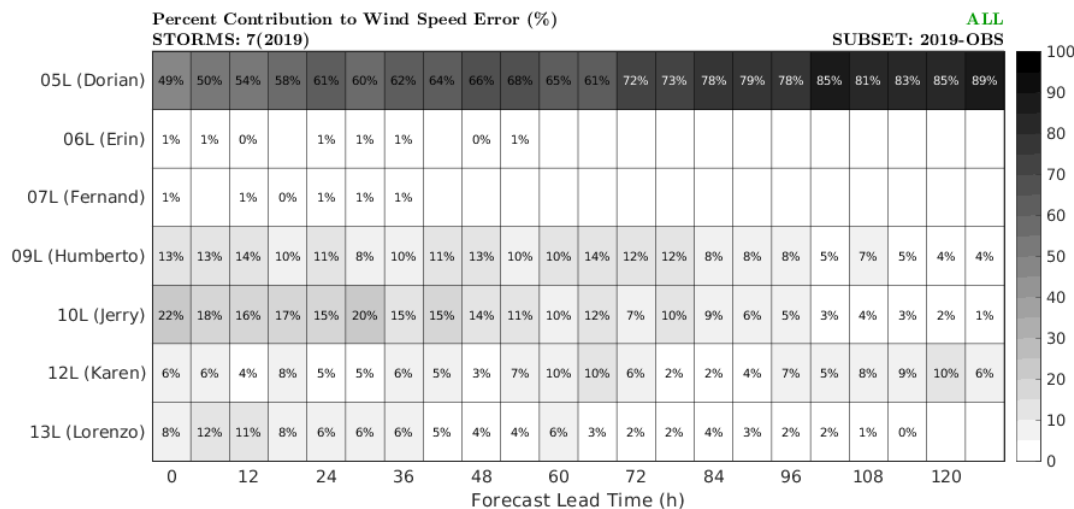


Assimilated Dropsonde Observations

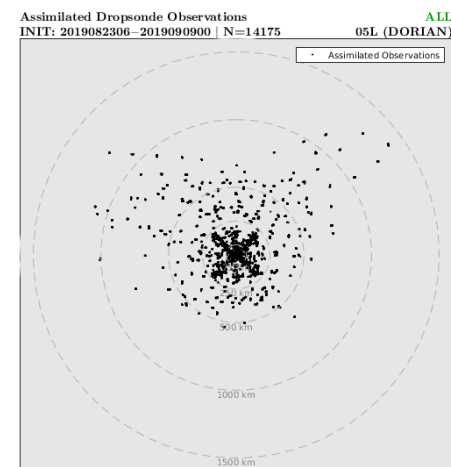


Assessment of 2019-OBS Performance

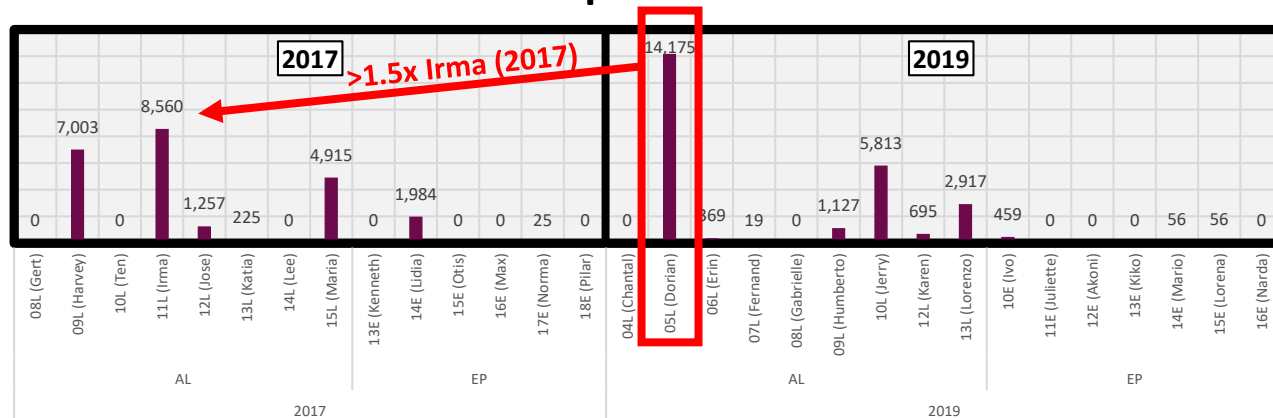
Individual Storm Contribution



Dorian's Dropsonde Distribution



Assimilated Dropsonde Observations



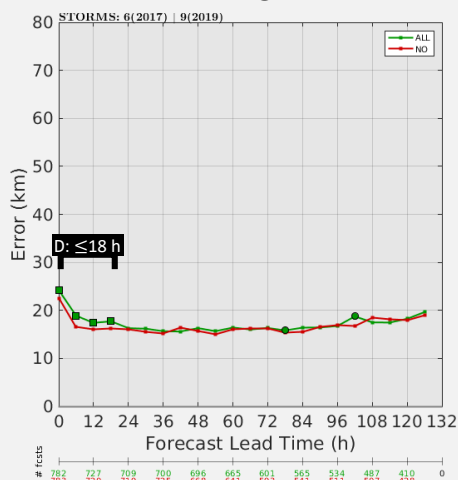
*Covers 2017 & 2019, only

■ (●): 95% (90%) sig.

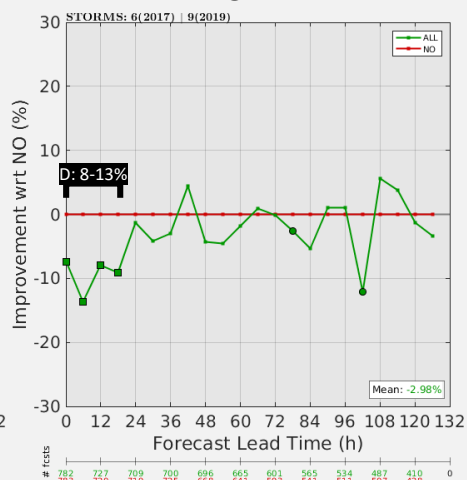
Full* Sample

Basin: AL | Verification: Consistent with NHC

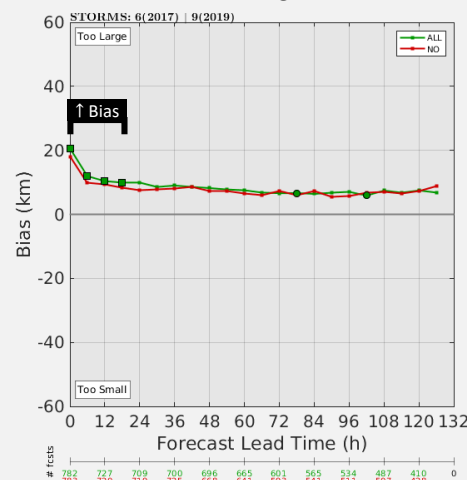
ERROR



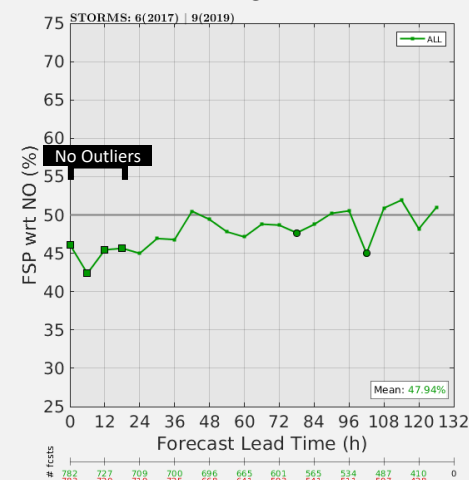
IMPROVEMENT



BIAS



FSP

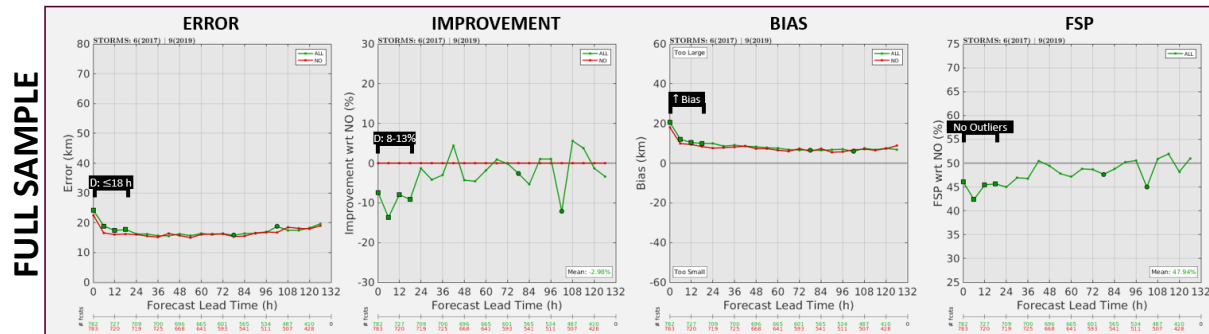


OVERALL ASSESSMENT

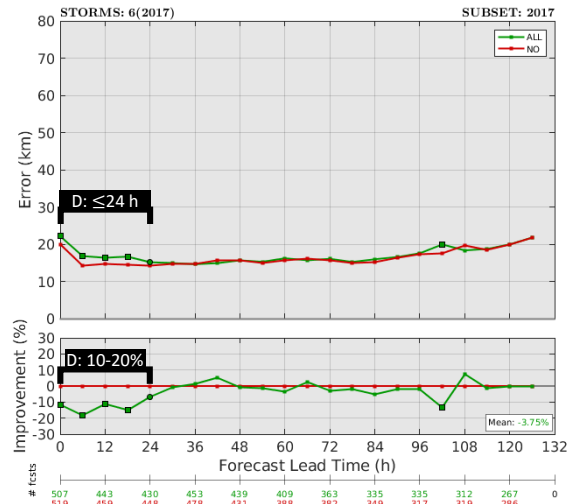
The inclusion of dropsondes degrades forecasts ≤ 18 h around 8-13%. Additionally, the assimilation of dropsondes slightly increased the bias and the degradation found was not driven by outliers.

Stratification By Year

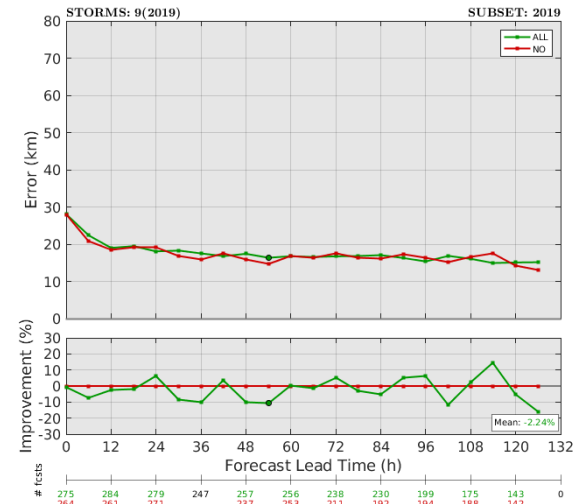
Basin: AL | Verification: Consistent with NHC



2017

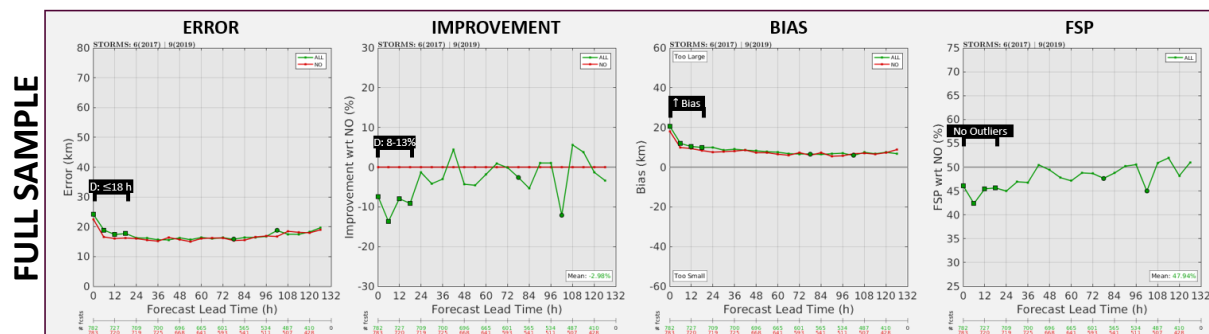


2019

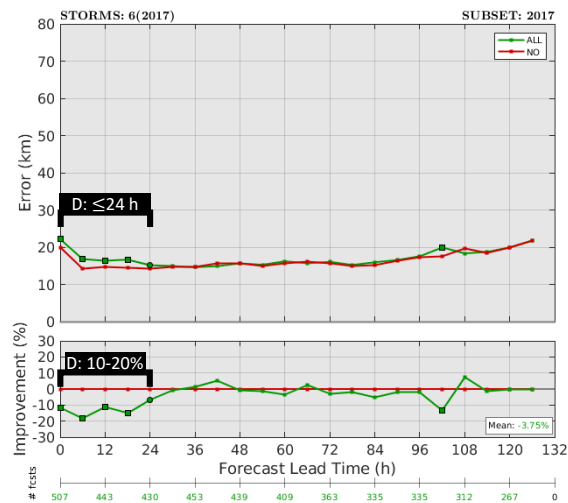


Stratification By Year

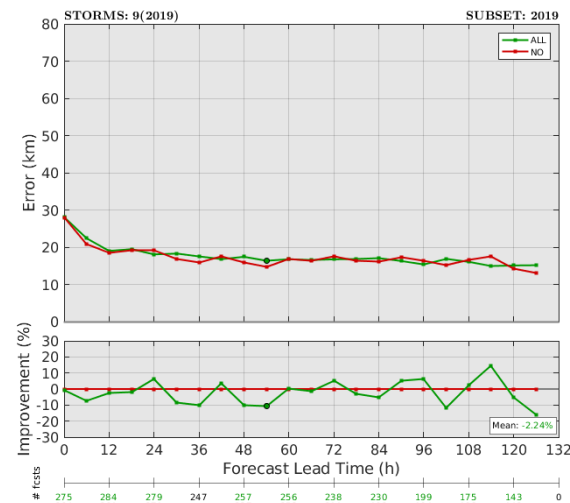
Basin: AL | Verification: Consistent with NHC



2017



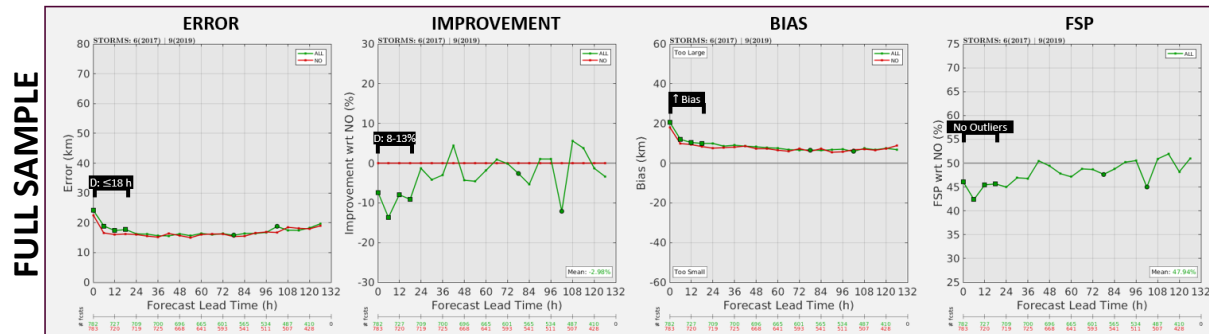
2019



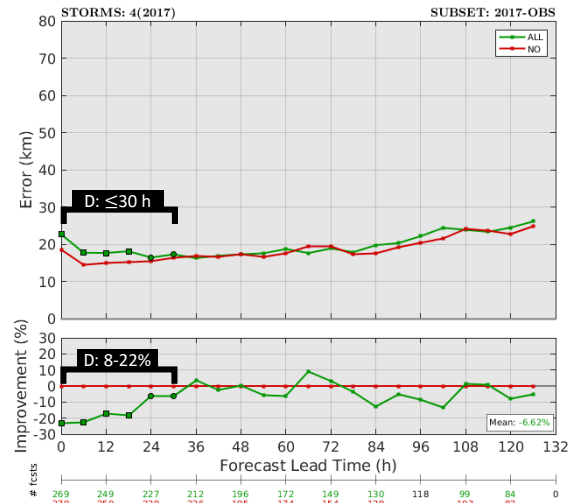
Between 2017 and 2019 there was a change to the observing system method – end-point dropsondes and an inner circumnavigation were both added. Could this be driving the interannual difference shown?

Stratification By Year & Data Availability

Basin: AL | Verification: Consistent with NHC

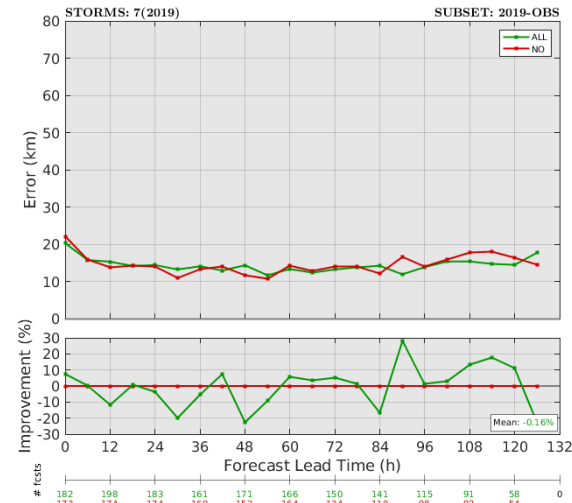


2017-OBS



Cycles from 2017 storms that did directly assimilate dropsondes

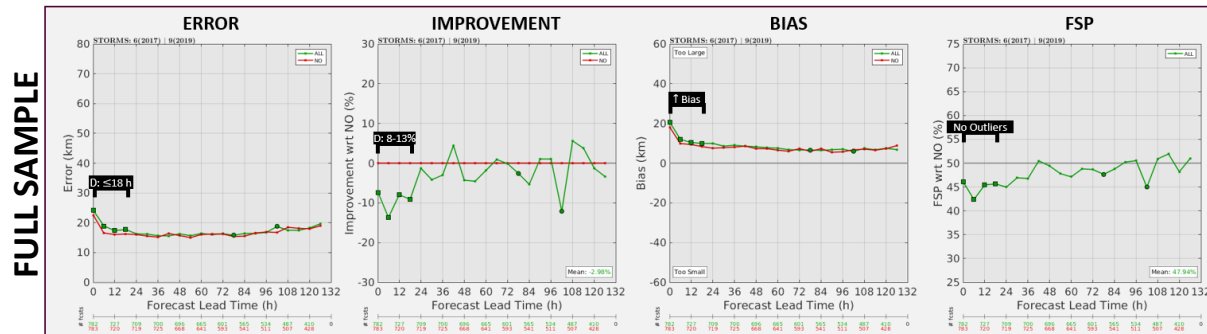
2019-OBS



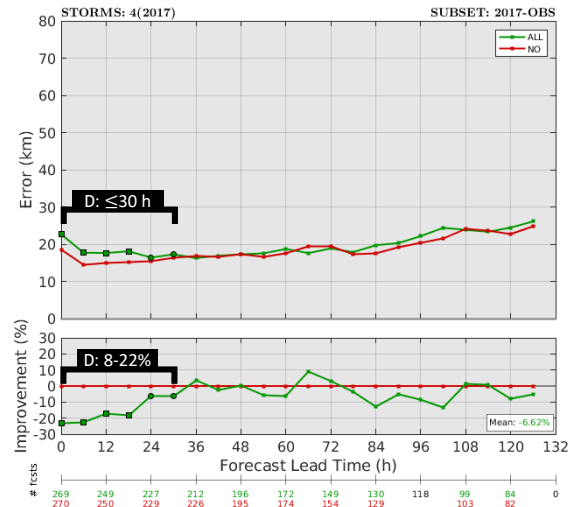
Cycles from 2019 storms that did directly assimilate dropsondes

Stratification By Year & Data Availability

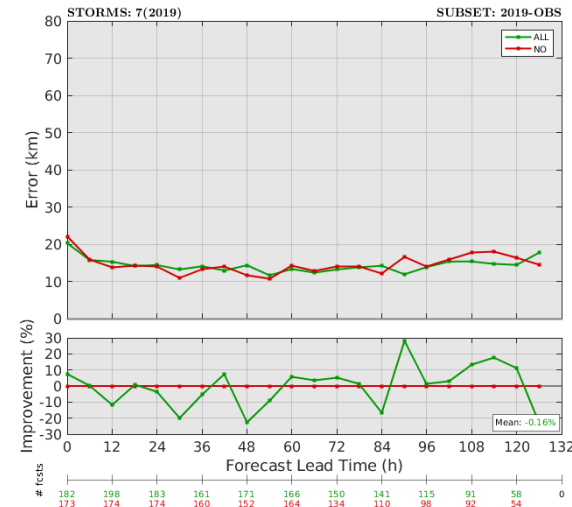
Basin: AL | **Verification: Consistent with NHC**



2017-OBS

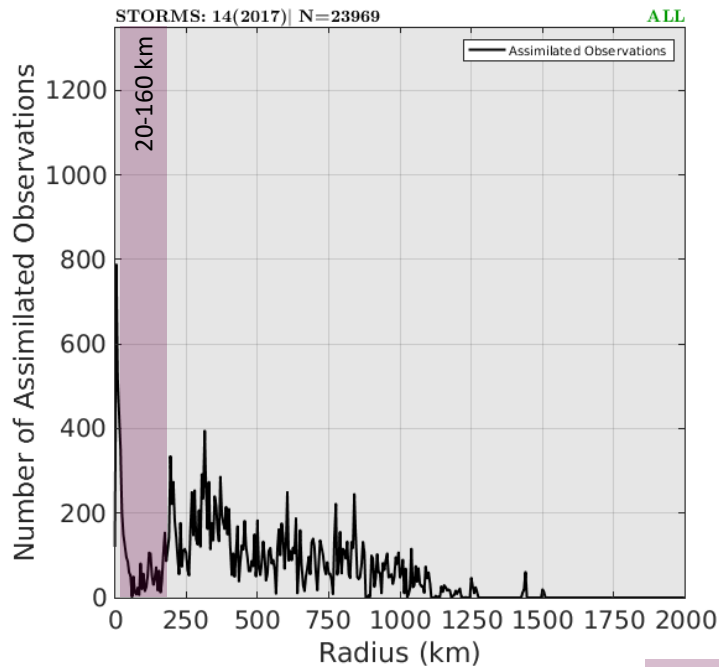
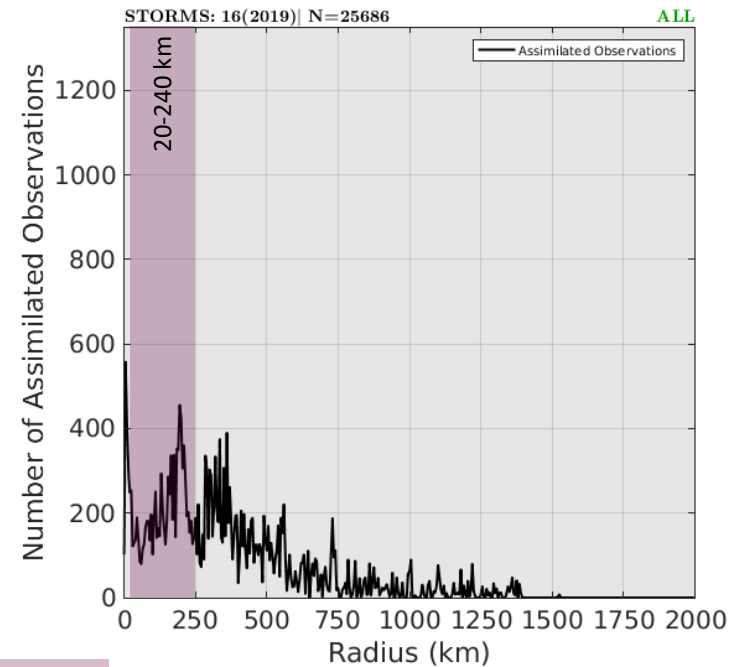


2019-OBS



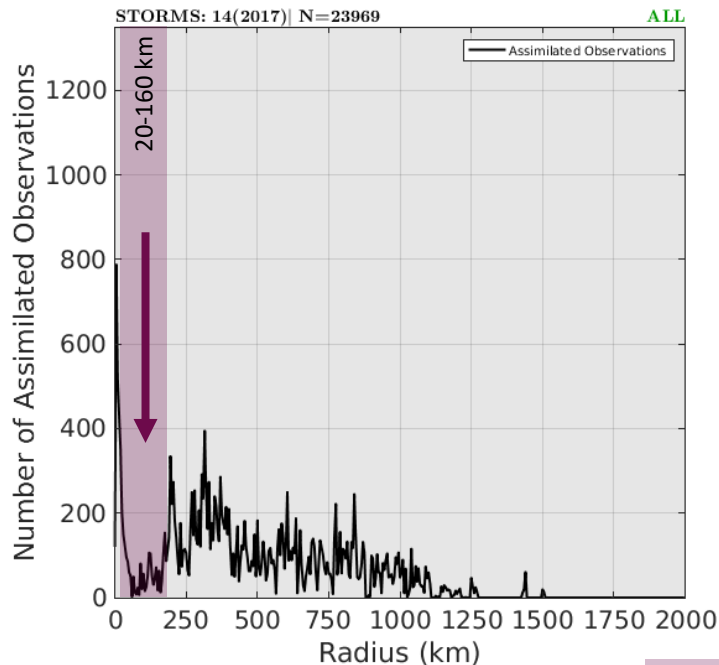
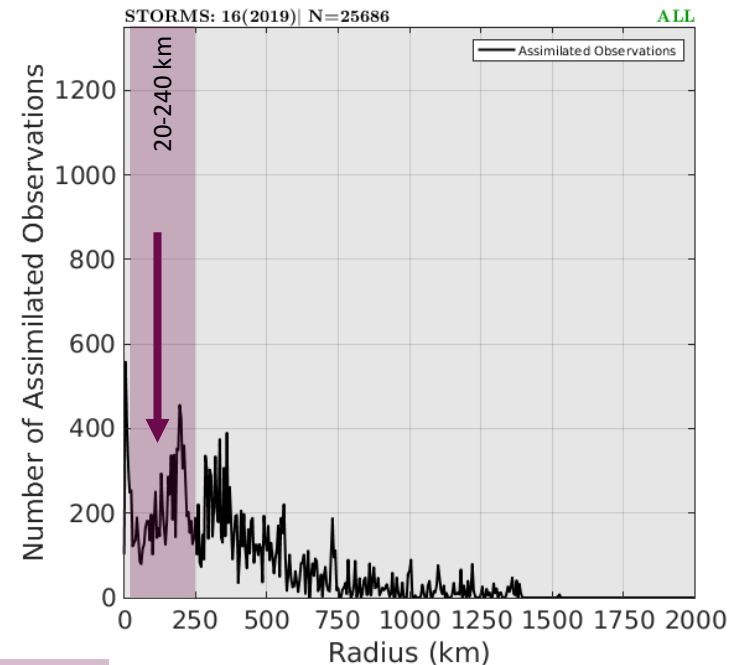
This indicates that cycles from storms with dropsondes in 2017 (2017-OBS) drove R64 degradation in the full sample.

Dropsonde Observations Stratified By Year

2017**2019**

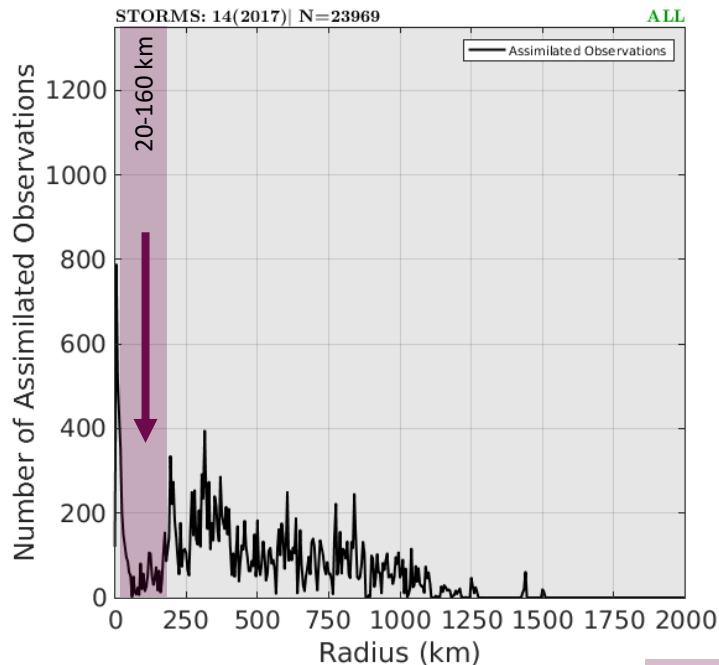
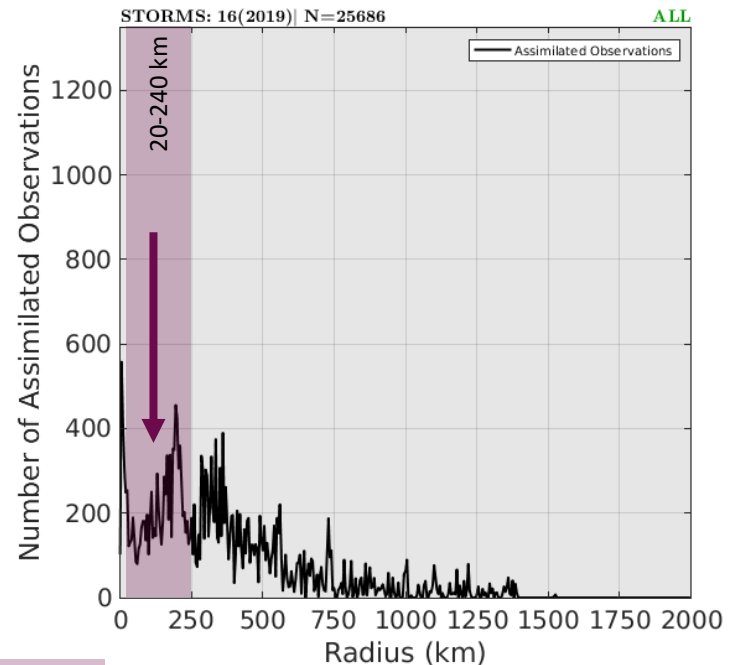
HURDAT2 R64 Observations

Dropsonde Observations Stratified By Year

2017**2019**

HURDAT2 R64 Observations

Dropsonde Observations Stratified By Year

2017**2019**

HURDAT2 R64 Observations

When investigating the storms that contributed to the 2017 and 2019 error and looking at the radial dropsondes distributions, those storms that had very few dropsondes within the 60-160 km radial range showed more degradation at early lead times.

Conclusion

PROJECT PLAN

OBJECTIVE: a composite study that quantifies both the overall and radial impact of dropsondes from aircraft on TC forecasts of track, intensity, and structure over the 2017–2019 hurricane seasons using the basin-scale HWRF

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TRACK

OVERALL

Dropsondes improved track forecasts btw 72-120 h around 3-5%

STRATIFICATIONS REVEALED...

- TS intensity storms drove track improvement
- Cycles with dropsondes in the parent domain outperformed cycles without dropsondes in the parent domain

WIND SPEED

OVERALL

Dropsondes improved wind speed forecasts ≥ 48 h around 4-9%

STRATIFICATIONS REVEALED...

- Cycles from storms with dropsondes in 2019 drove wind speed improvement (~14% at nearly all lead times)
- Dorian (2019) drove much of the wind speed improvement

R64

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Dropsondes degraded R64 forecasts ≤ 18 h around 8-13%

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- Storms with few dropsondes in the observed R64 window had more degradation

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STAY TUNED FOR MORE RESULTS UPON THE COMPLETION OF 2018 AS WELL AS RESULTS FOR THE **NTG (incl. ≥ 250), **NIC** (incl. ≥ 75 km), **TG** (incl. < 250 km), AND **IC** (incl. < 75 km) EXPERIMENTS!**

THANK YOU FOR LISTENING!



Dr. Sarah D. Ditchek

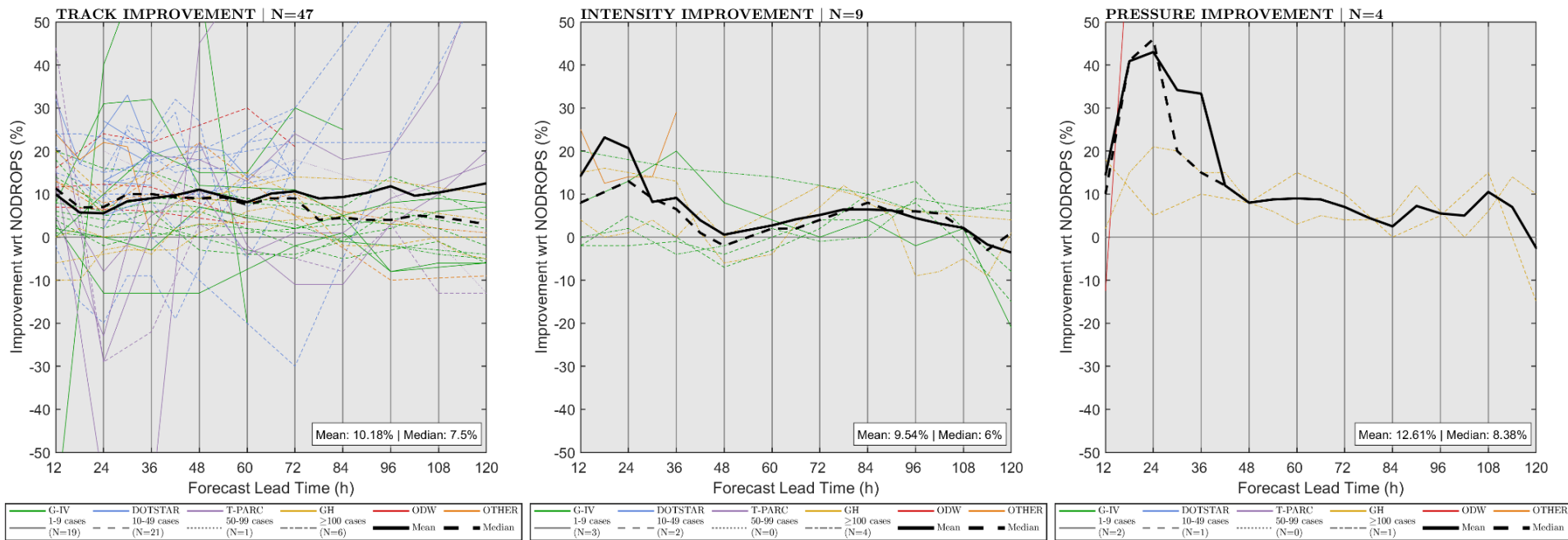
Email: sarah.d.ditchek@noaa.gov

Website: <http://www.atmos.albany.edu/student/sditchek/>

*10 experiments had unquantifiable improvement – qualitatively, all showed overall improvement due to dropsonde assimilation

Motivation

A total of 57 experiments across 30 papers ranging from 1992 – 2019 were identified that documented the impact of dropsondes on tropical cyclone forecasts, and improvement by forecast lead time was digitized. The percent improvement for 47* experiments are summarized below.

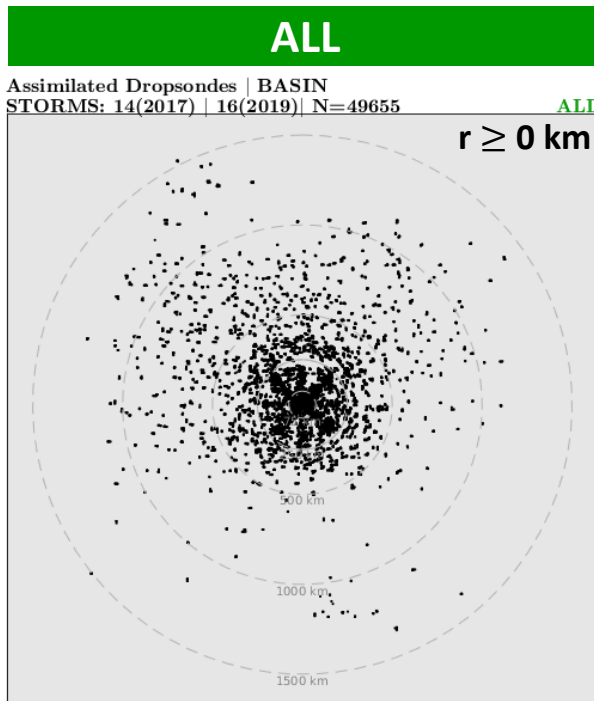


Only 6 experiments had ≥ 100 cases, with a mean (median) improvement of 2.85% (3.00%).

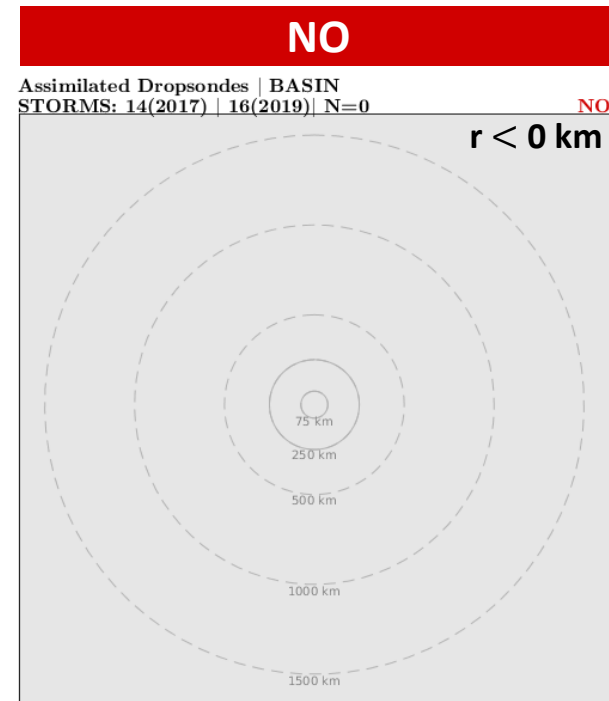
Very few studies quantified the impact of dropsondes on intensity and pressure. With many dropsondes being deployed with the purpose of identifying storm intensity, this was surprising.

Dropsonde Observations

Given below are the storm-relative locations of assimilated dropsonde observations in the **ALL** & **NO** experiments.



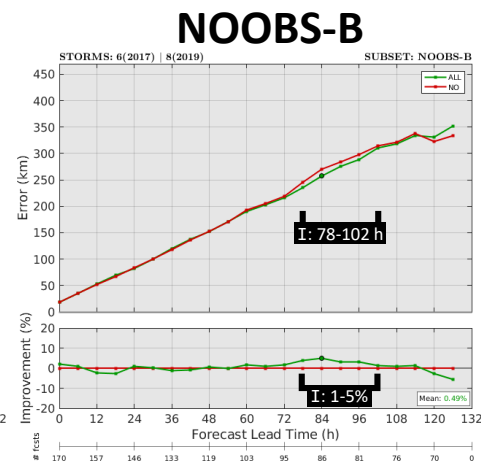
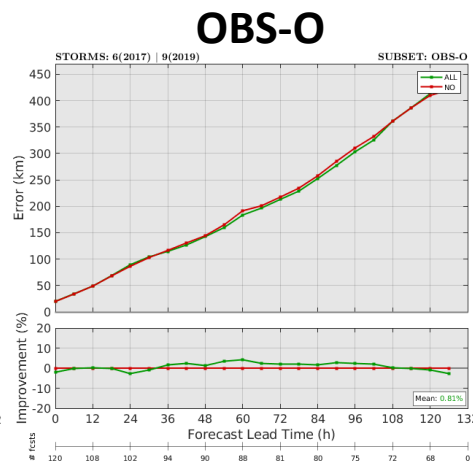
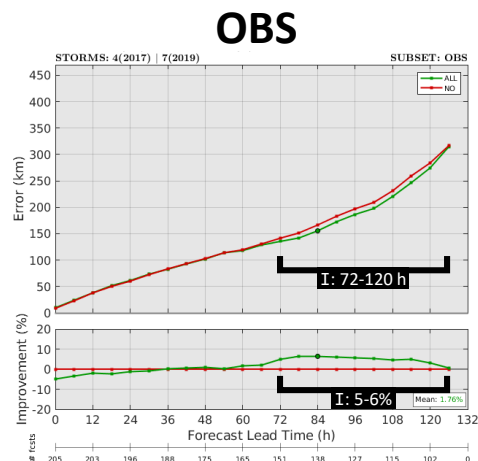
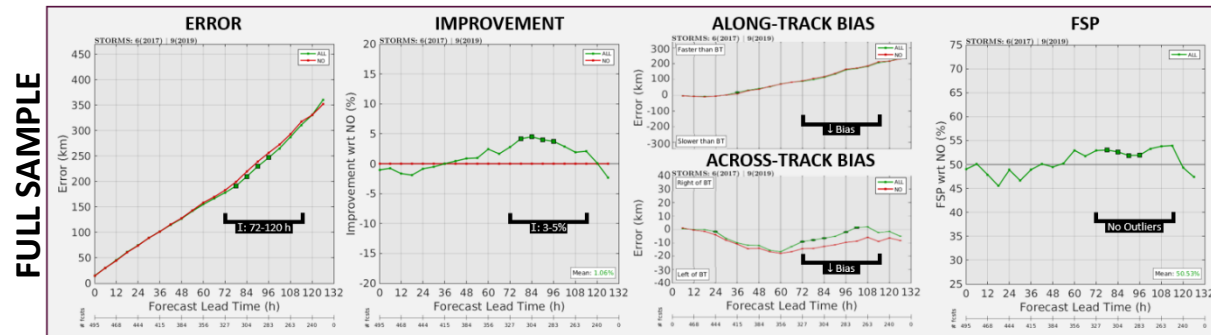
N=49655



N=0

Stratification By Data Availability

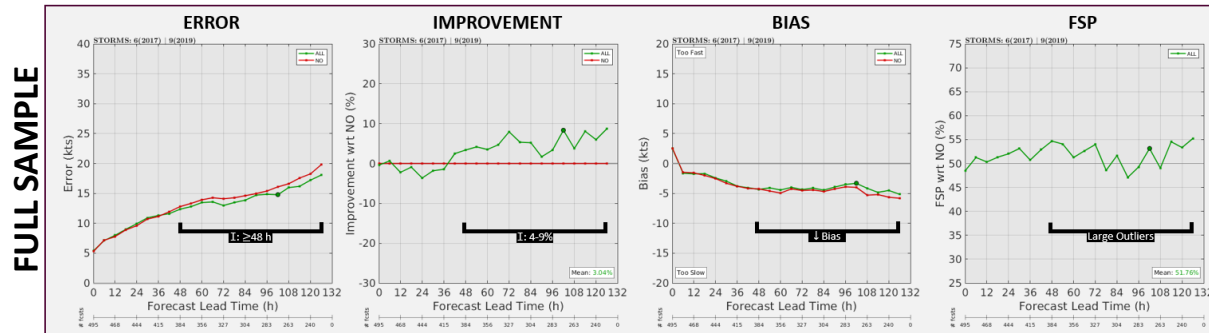
Basin: AL | **Verification:** Consistent with NHC



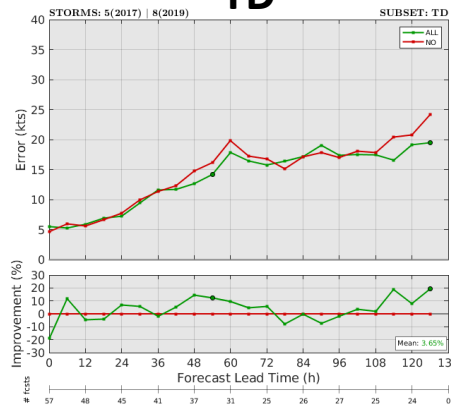
Cycles from storms with dropsondes (OBS) showed 5-6% improvement between 72-120 h.

Stratification By Intensity

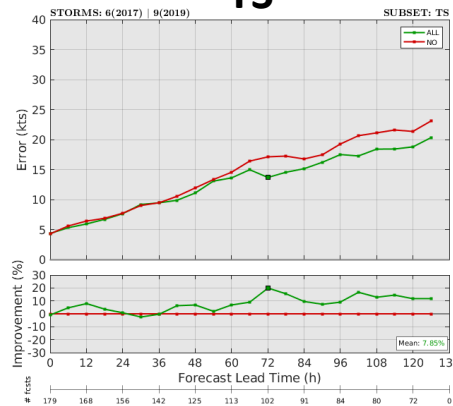
Basin: AL | **Verification:** Consistent with NHC



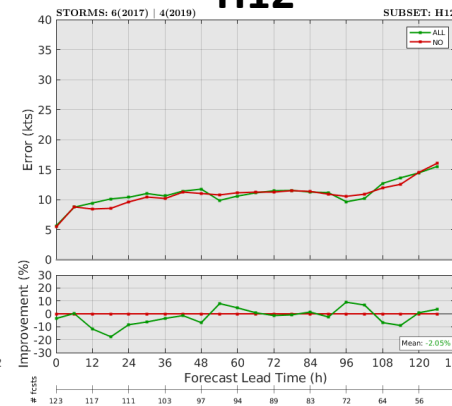
TD



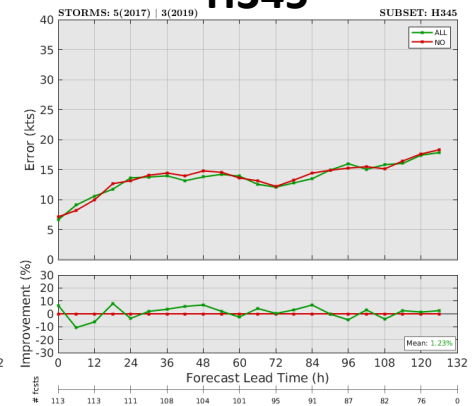
TS



H12



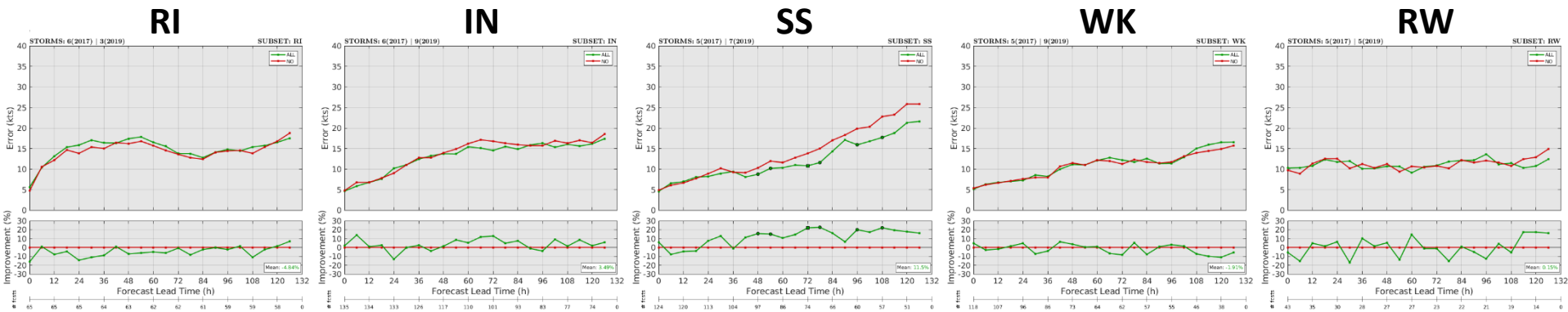
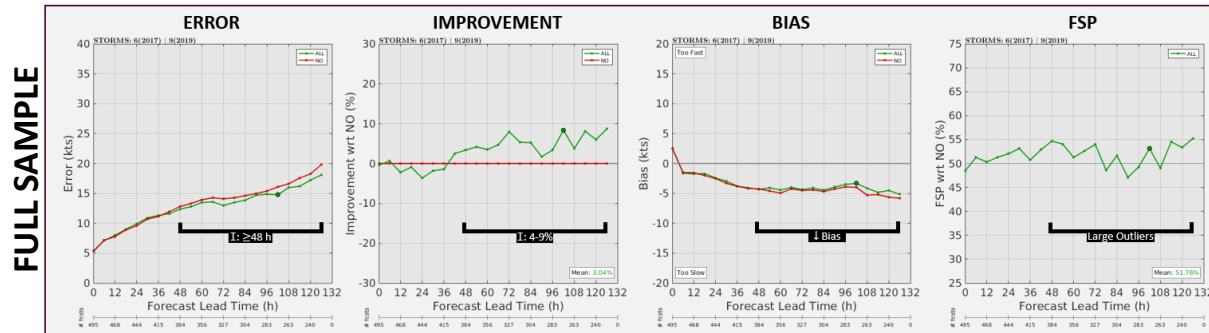
H345



TS intensity storms drove wind speed improvement, but this improvement was mostly due to Dorian (2019).

Stratification By Intensity Change

Basin: AL | Verification: Consistent with NHC



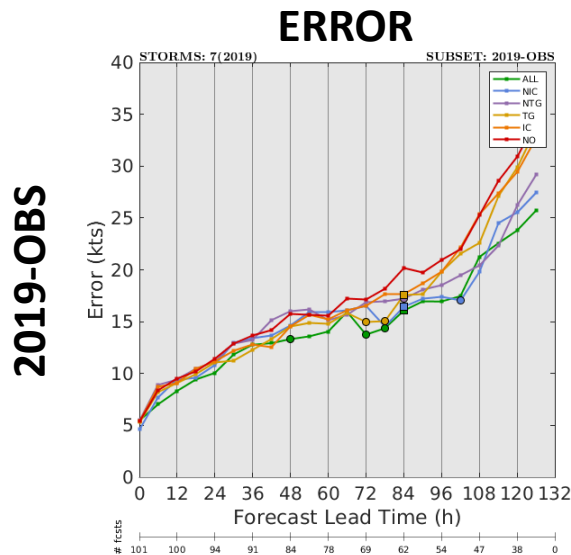
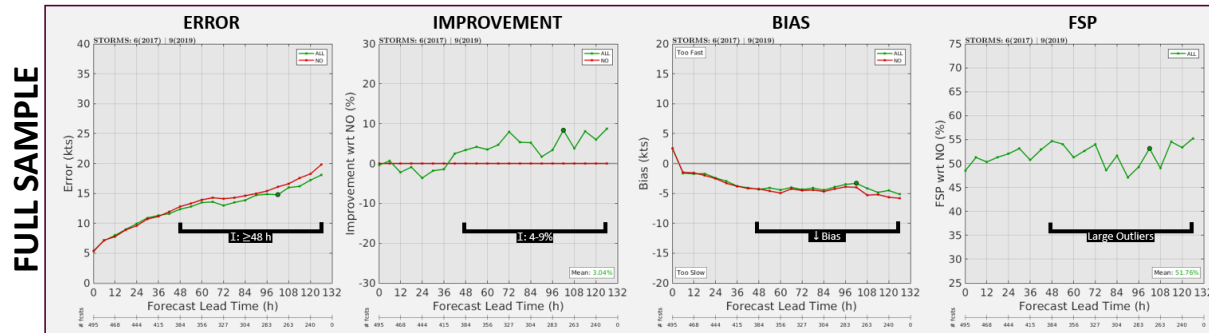
For the BT of a storm, calculate running -6 h to +6 h intensity change to capture what type of intensity change the storm is currently undergoing

For cycles where at $t=0$ that value is...

- $x \geq 15$ kt: categorize as RI
- $5 \leq x < 15$ kt: categorize as IN
- $-5 < x < 5$ kt: categorize as SS
- $-15 < x \leq -5$ kt: categorize as WK
- $x \leq -15$ kt: categorize as RW

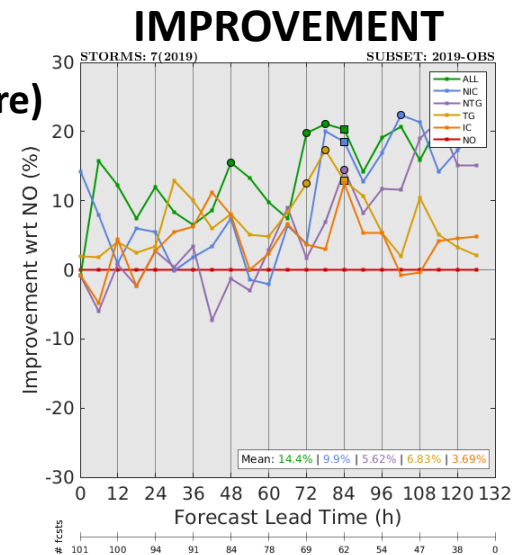
Stratification By Year & Data Availability

Basin: AL | **Verification:** Consistent with NHC



PERFORMANCE RANKING

- 1) **ALL** (dropsondes everywhere)
- 2) **NIC** (deny <75 km)
- 3) **NTG** (deny <250 km)
- 4) **TG** (deny ≥250 km)
- 5) **IC** (deny ≥75 km)
- 6) **NO** (deny everywhere)

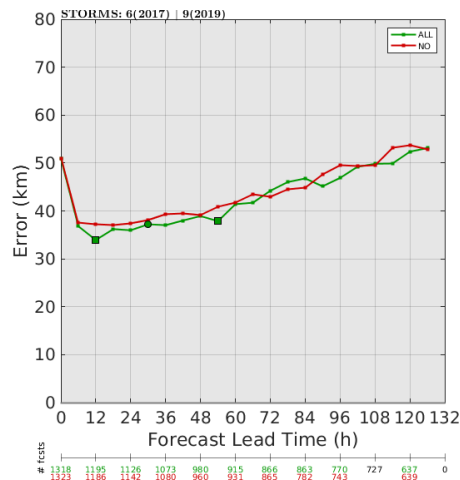


Overall, **ALL** performed the best. Between 24-78 h, removing synoptic dropsondes (**TG**) performed second best. After 78 h, having dropsondes ≥75 km is key (**ALL**, **NIC**, **NTG**), particularly ≥250 km (**NTG**).

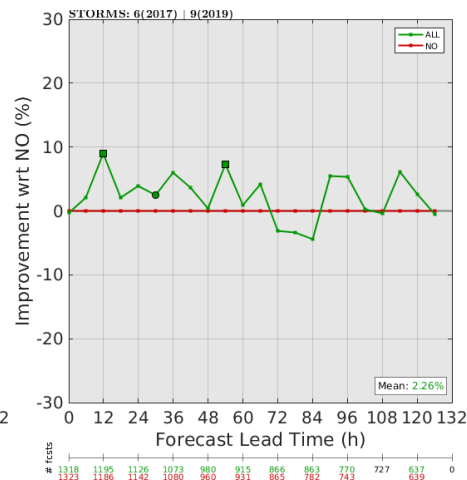
Full Sample

Basin: AL | Verification: Consistent with NHC

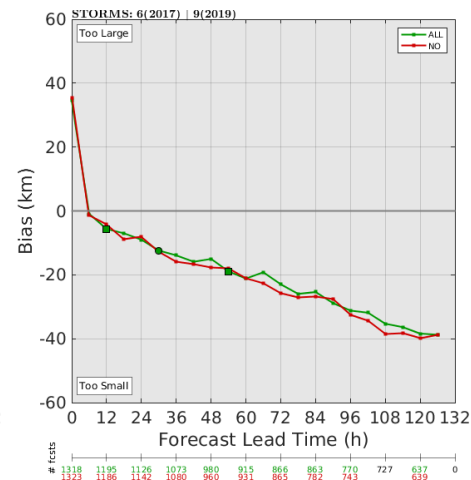
ERROR



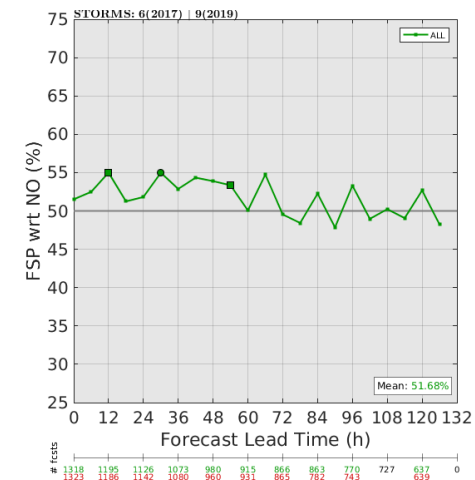
IMPROVEMENT



BIAS



FSP



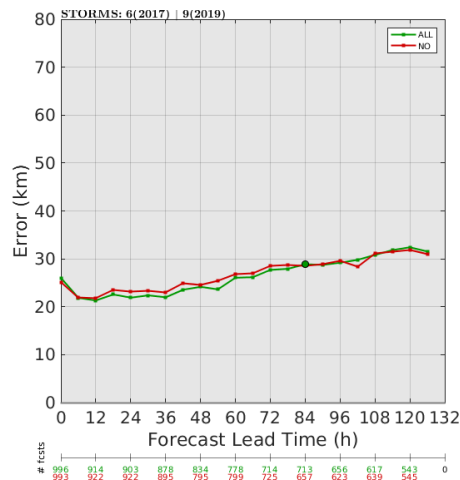
OVERALL ASSESSMENT

The inclusion of dropsondes improves R34 forecasts at nearly all lead times on average 2%, with many lead times above 5%. Additionally, the assimilation of dropsondes reduces the bias and the improvement found isn't driven by large outliers.

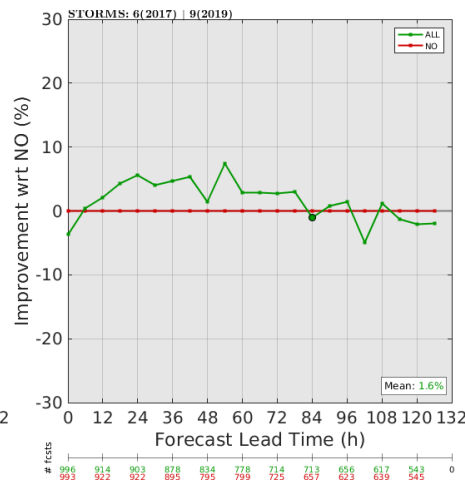
Full Sample

Basin: AL | Verification: Consistent with NHC

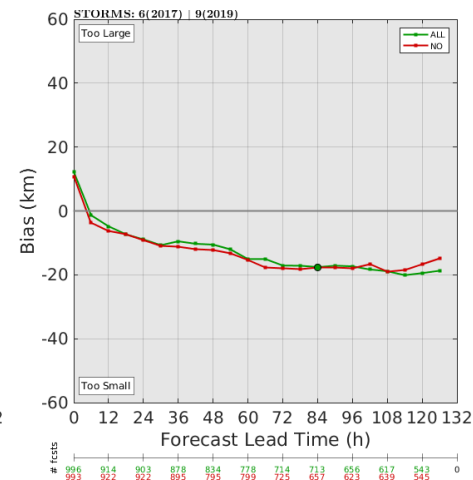
ERROR



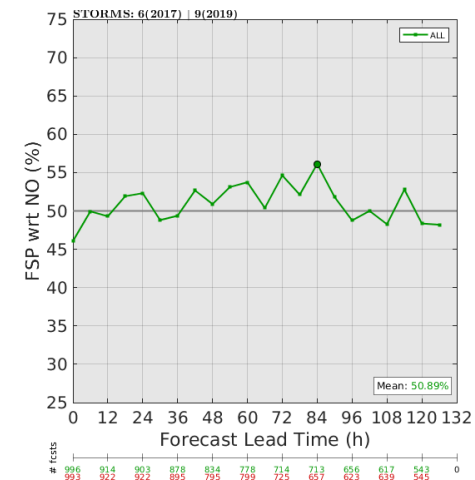
IMPROVEMENT



ALONG-TRACK BIAS



FSP

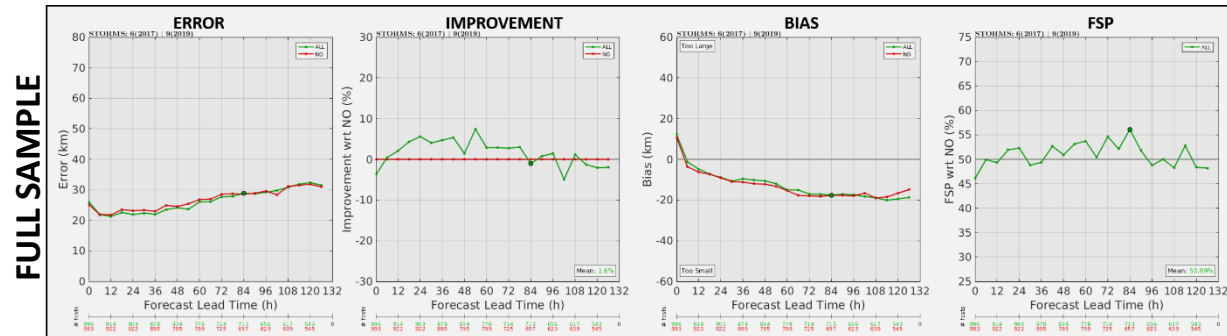


OVERALL ASSESSMENT

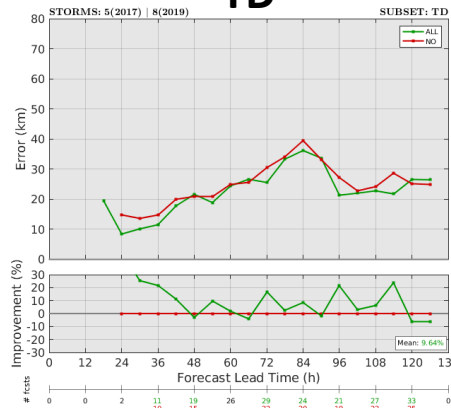
The inclusion of dropsondes improves R50 forecasts ≤ 78 h around 3-7%. Additionally, the assimilation of dropsondes reduces the bias and the improvement found is driven by large outliers.

Stratification By Intensity

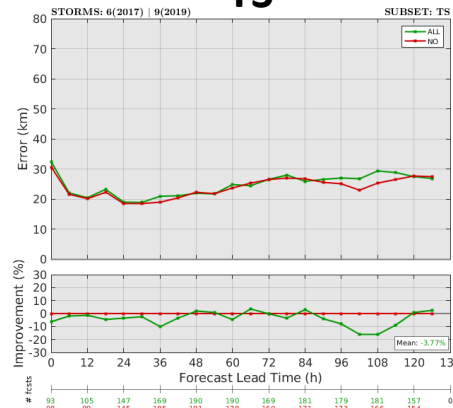
Basin: AL | **Verification:** Consistent with NHC



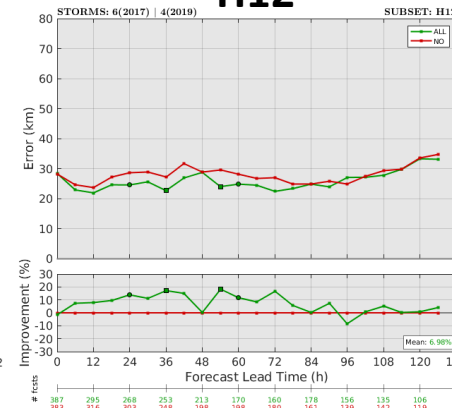
TD



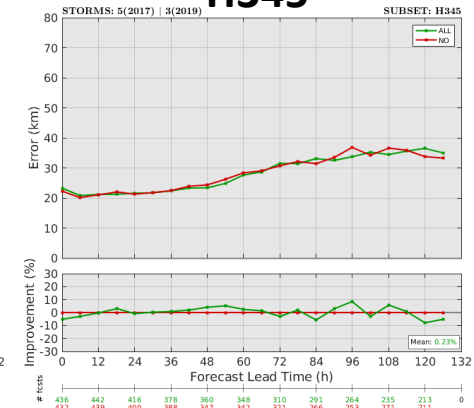
TS



H12



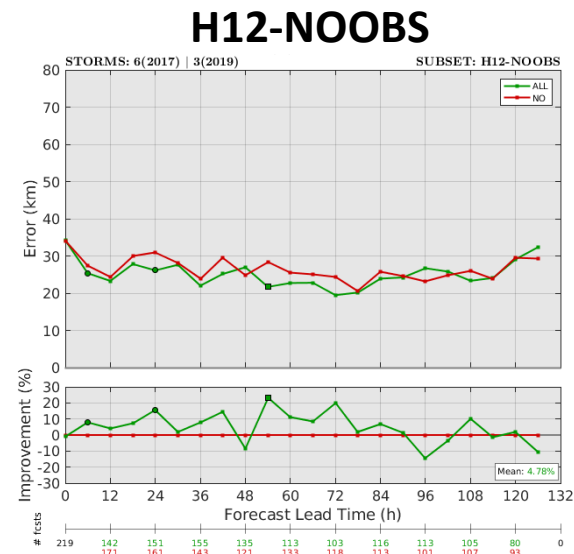
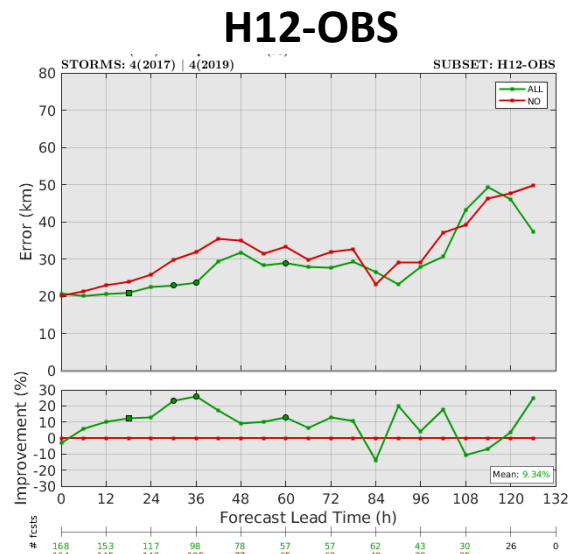
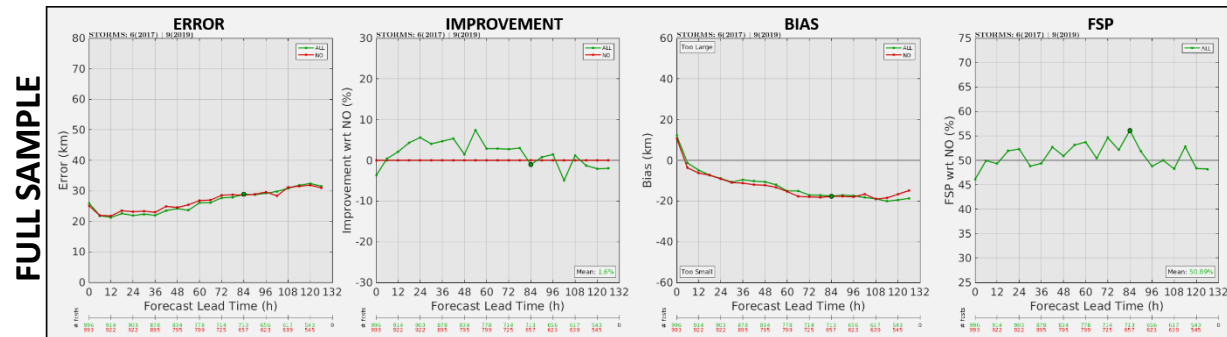
H345



H12 intensity storms drove R50 improvement, with 10-20% R50 improvement ≤ 78 h.

Stratification By H12 & Data Availability

Basin: AL | Verification: Consistent with NHC



This indicates that cycles from H12 storms with dropsondes (H12-OBS) drove R50 improvement in the full sample.