



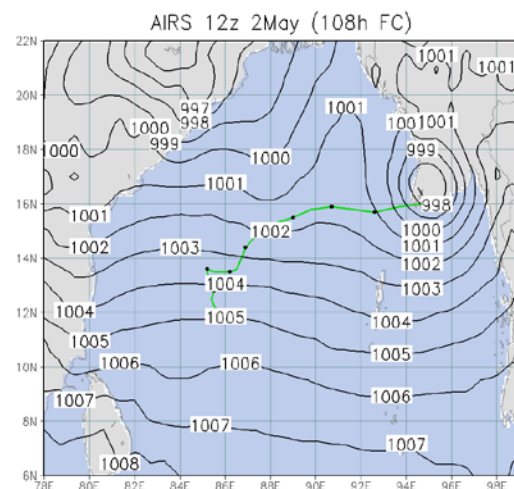
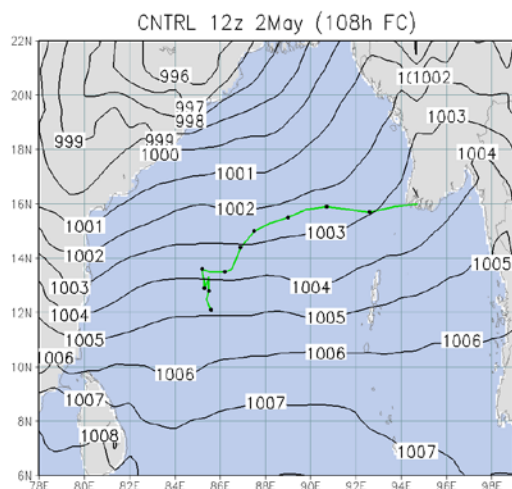
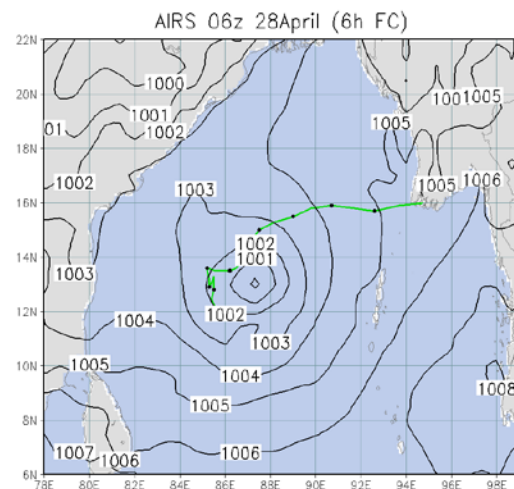
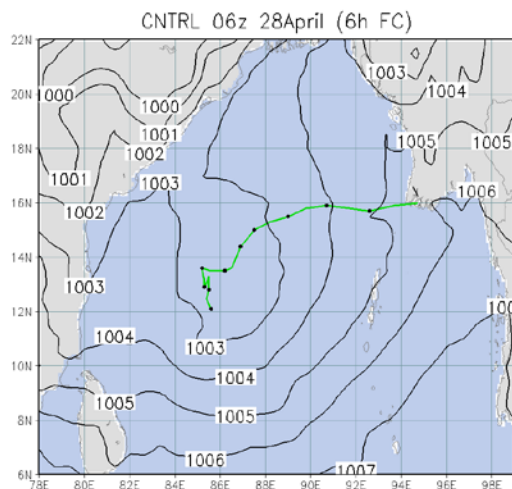
# Advances towards ingestion of multi-instrument cloud-cleared infrared radiances in a global data assimilation and forecast framework

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## More than ten years ago (2008): first attempt to improve the representation of a tropical cyclone in a global data assimilation system using AIRS cloud-cleared retrievals



Green:  
Observed  
Track

Catastrophic Tropical Cyclone Nargis (2008)

Missed in all operational analyses

when it was already at hurricane intensity level.

Assimilation of v5 AIRS cloud-cleared retrievals produced a well-defined low from which successful 5-day forecasts could be initialized. Horizontal resolution of the state-of-the-art GEOS was half a degree!

Unfortunately, in spite of subsequent studies by this team demonstrating the superiority of **cloud-cleared retrievals** against **clear-sky radiances**, operational centers did not consider the real-time assimilation of retrievals possible because of **latency** and **external dependencies**

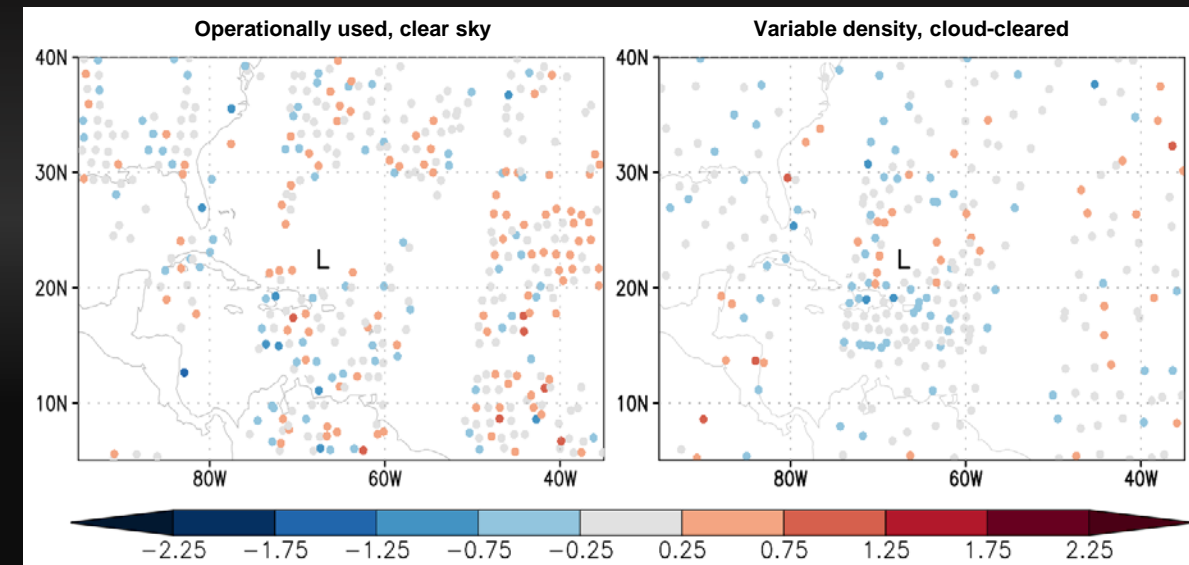
Reale, O., W. K. Lau, J. Susskind, R. Rosenberg, E. Brin, E. Liu, L.P. Riishojgaard, M. Fuentes, R. Rosenberg, 2009: AIRS impact on the analysis and forecast track of tropical cyclone Nargis in a global data assimilation and forecasting system. *Geophys. Res. Lett.*, 36, L06812, doi: 10.1029/2008GL037122

# Ten years later (2018): major findings in the assimilation of AIRS radiances

Article published in August 2018 summarizes the work done by this team on the assimilation of *adaptively thinned AIRS cloud-cleared radiances* against *homogeneously thinned clear-sky radiances*.

Reale, O., E. McGrath-Spangler, W. McCarty, D. Holdaway, R. Gelaro, 2018: Impact of adaptively thinned AIRS cloud-cleared radiances on tropical cyclone representation in a global data assimilation and forecast system. *Weather and Forecasting*, 33, 908-931.

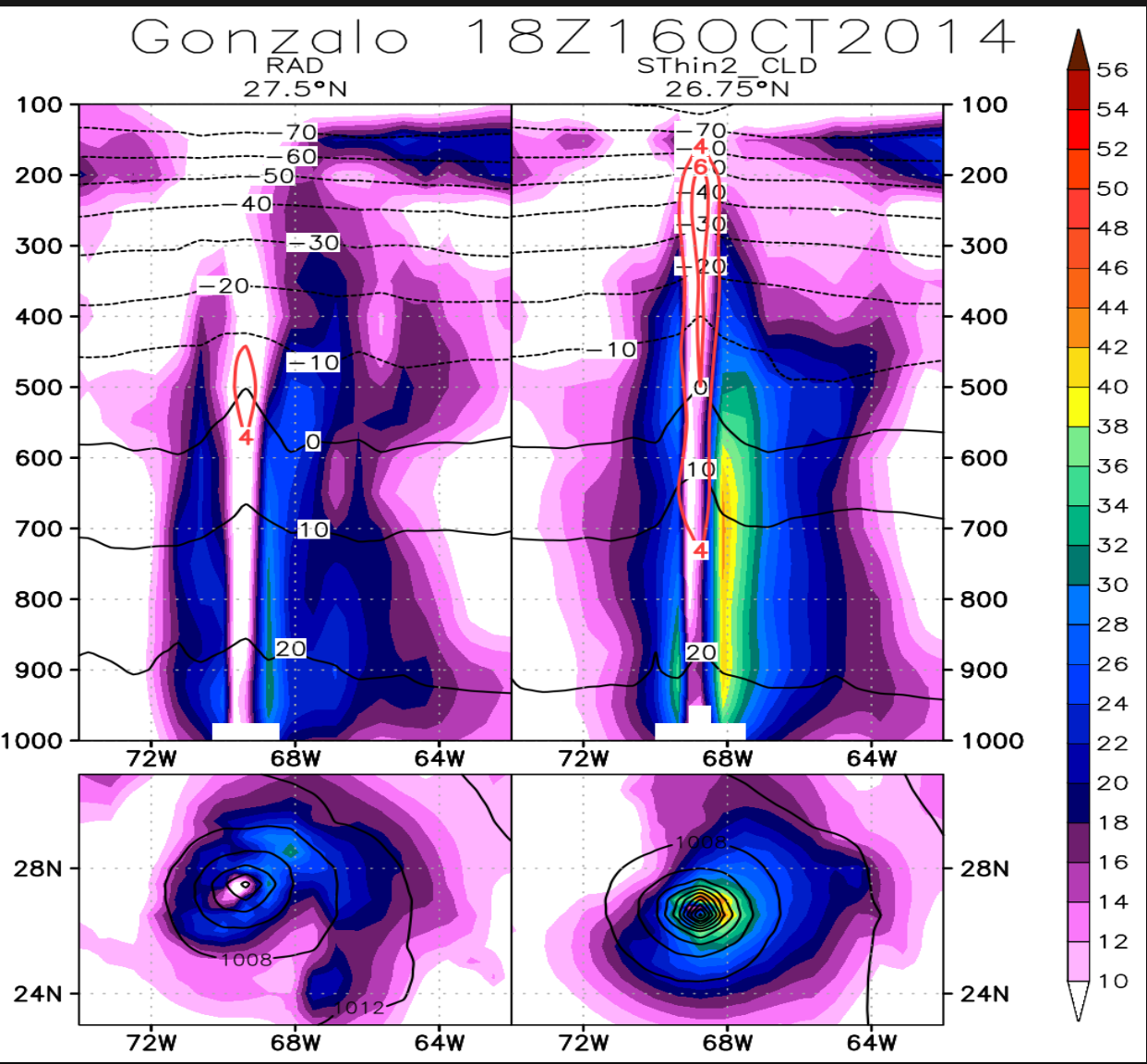
- 1) Cloud-cleared AIRS radiances are substantially superior compared to clear-sky radiances, as long as they are more aggressively thinned
- 2) An adaptive strategy that assimilates *more data around TCs*, and *less globally*, improves TC structure and intensity forecast, without damaging global skill.



Operational, clear-sky

Variable density, cloud-cleared

Shading: wind speed  
 Black contours: temperature (top), sea level pressure (bottom)  
 Red contours: temperature anomaly



Reale et al (2018) shows that **cloud-cleared radiances** are a substantially better product than **clear-sky radiances** when assimilated **with a global density of about 300 km**.

An **increased density only around TCs** improves TC structure dramatically.

**Caveats:** limited by AIRS coverage; negligible impact on very small or very large TCs and on TC track forecast.

Question: What is the impact of this adaptive methodology if it is simultaneously applied to *all* hyperspectral sensors?

Next step: test an adaptive strategy on **CrIS** and **IASI**

## New Experiments to evaluate the adaptively thinned procedure extended to all hyperspectral sensors

GEOS-5 DAS version 5-13.0p1

Assimilation from 1 Sep – 10 Nov 2014 of *all observations* assimilated operationally

10 day forecasts initialized daily at 00Z from 10<sup>th</sup> Sep – 9<sup>th</sup> Nov 2014

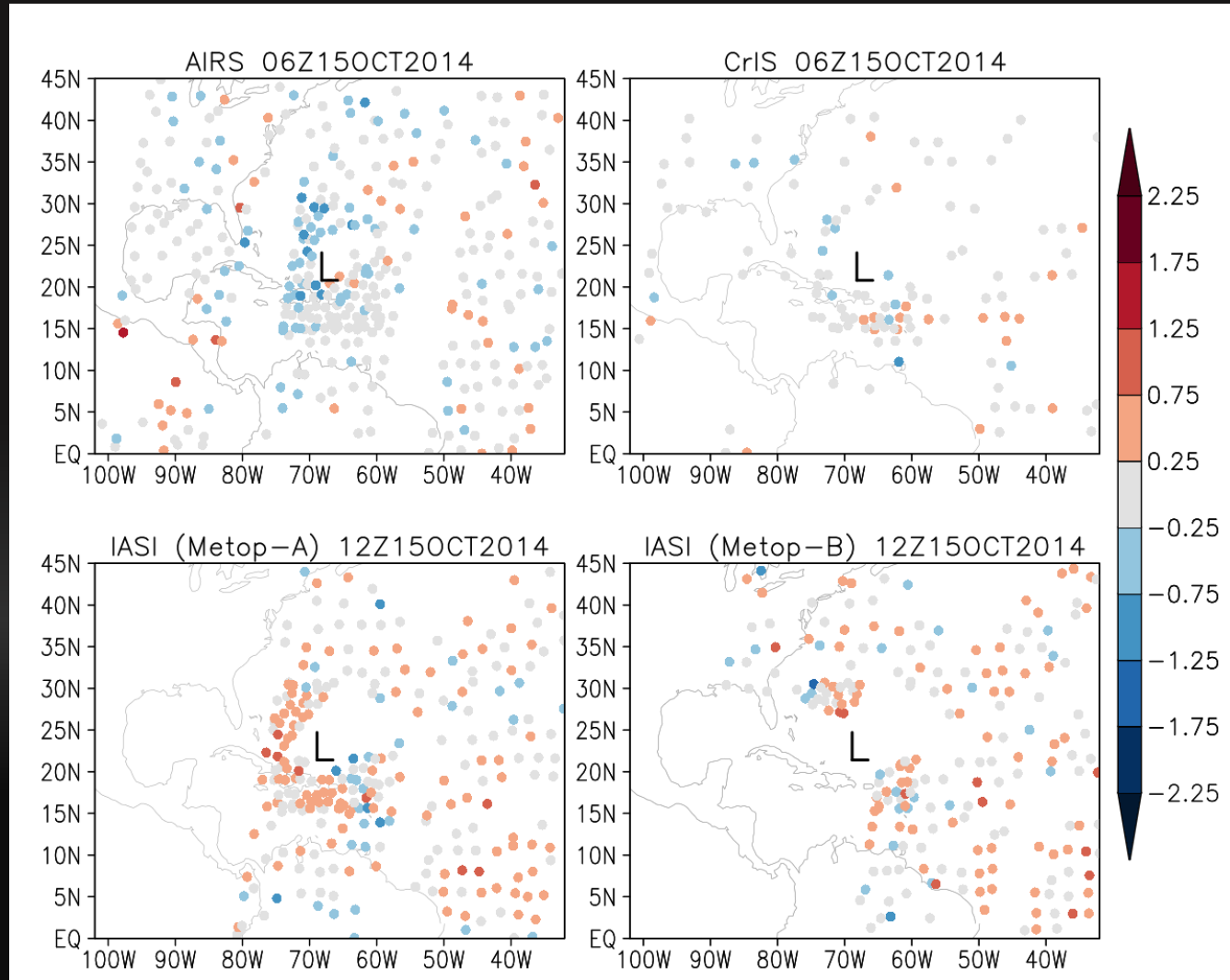
- **OPS**: AIRS clear-sky radiances, regularly-spaced thinning
- **RAD**: AIRS clear-sky radiances, regularly-spaced thinning, no vortex relocator
- **SThin2\_CLD**: Adaptively thinned AIRS cloud-cleared radiances (the best of the configurations resulting from our published work), no vortex relocator
- **SThin2\_CLD\_SThin2CriS\_Sthin2IASI**: *adaptively thinned AIRS cloud-cleared radiances plus adaptively thinned clear-sky CrIS and IASI, no vortex relocator*

# Hyperspectral observations around Hurricane Gonzalo

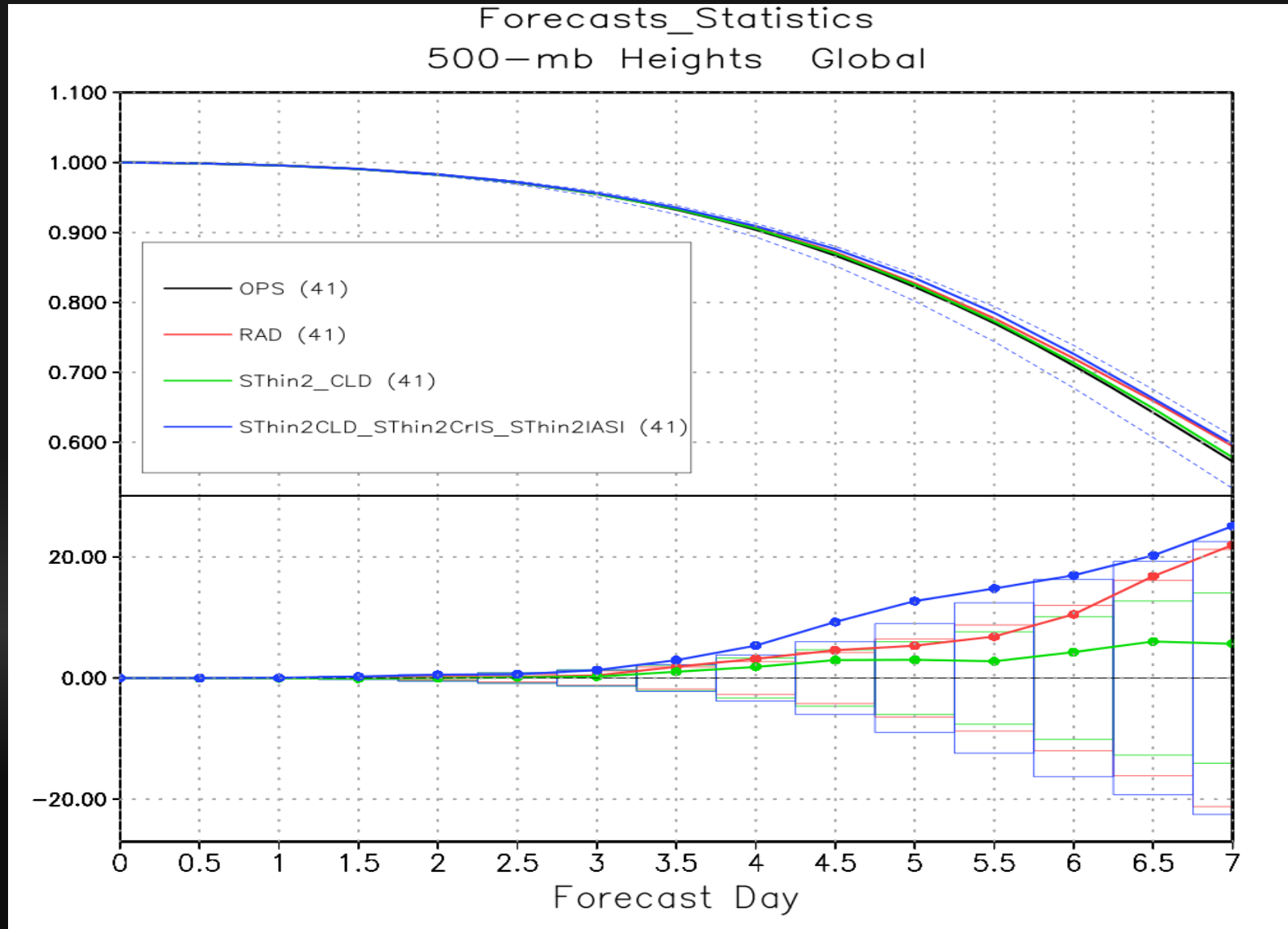
Different coverages around TCs

Cloud-cleared radiances available only for AIRS

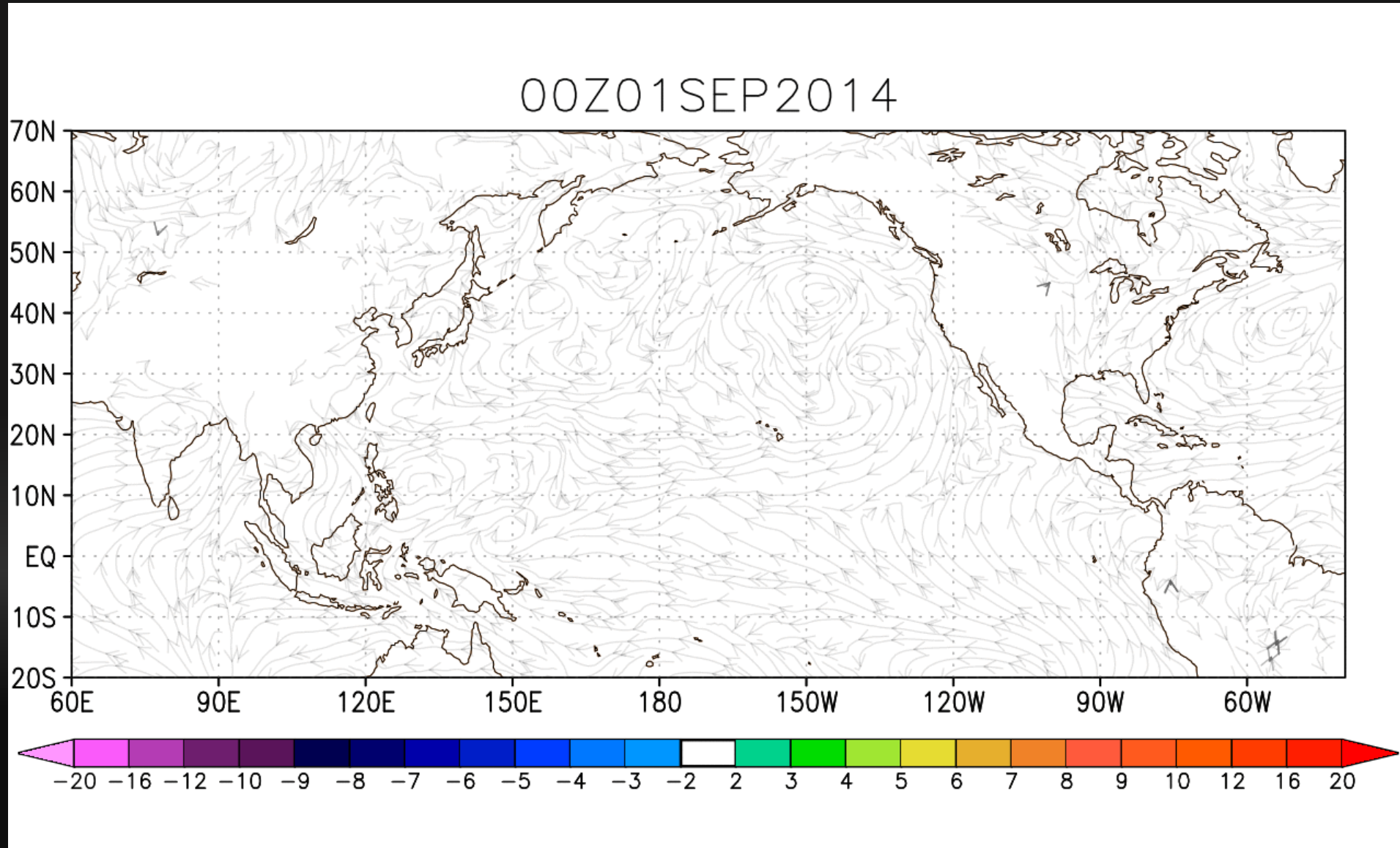
Clear-sky radiances have large data void areas corresponding to TCs circulations



# Global 500 hPa height anomaly correlation

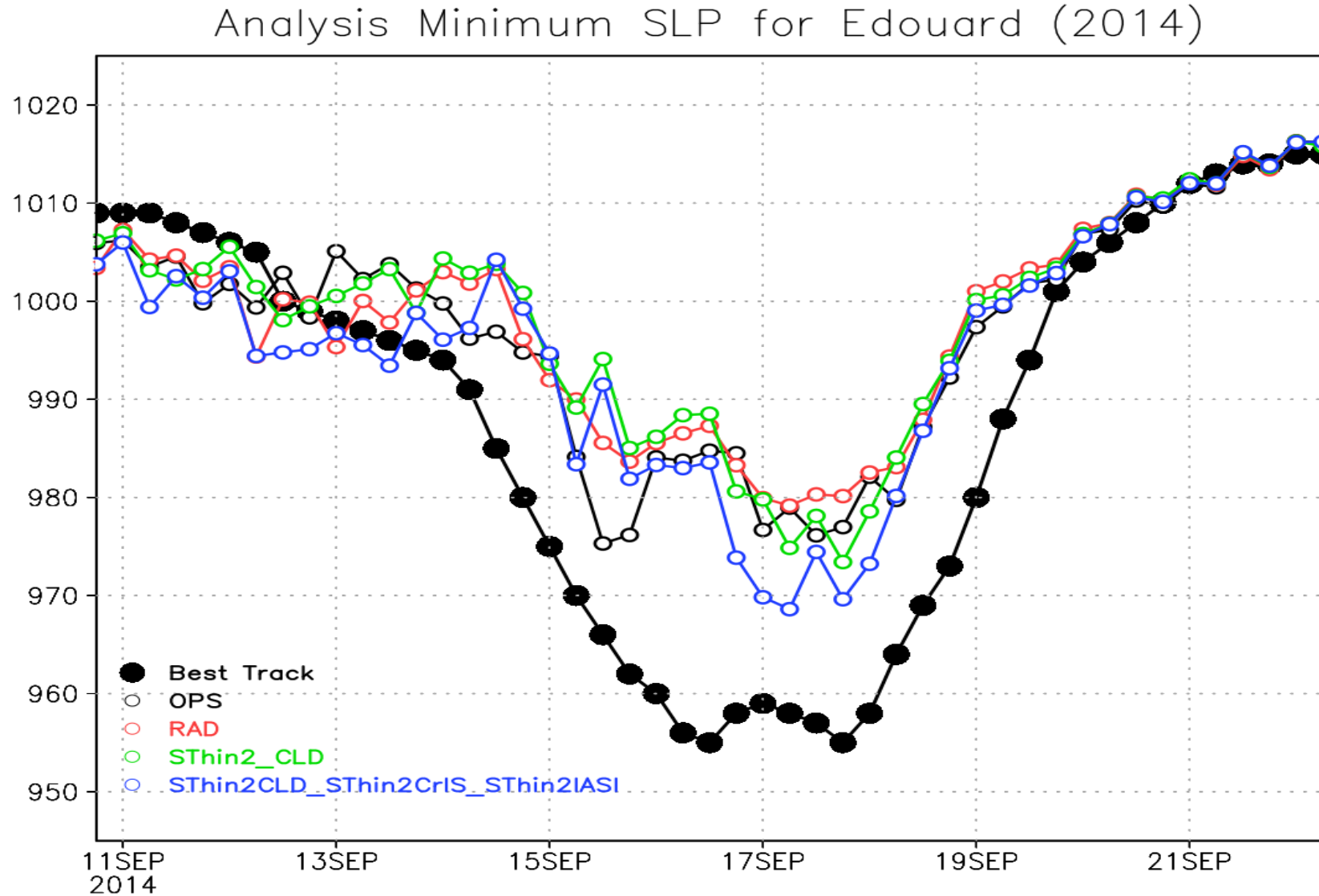


# Impact of assimilating adaptively AIRS CCRs + CrIS and IASI on slp: TCs worldwide are affected

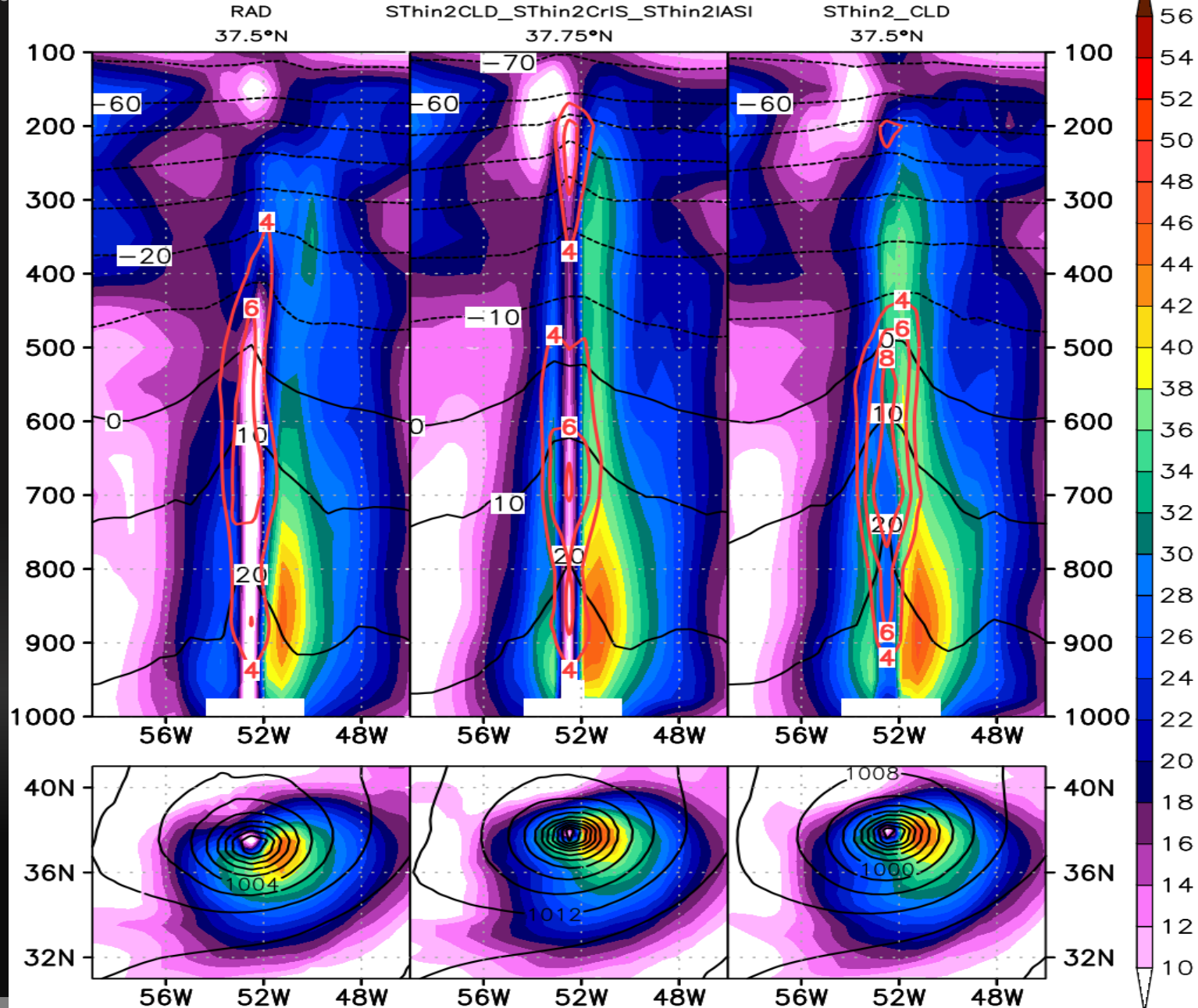




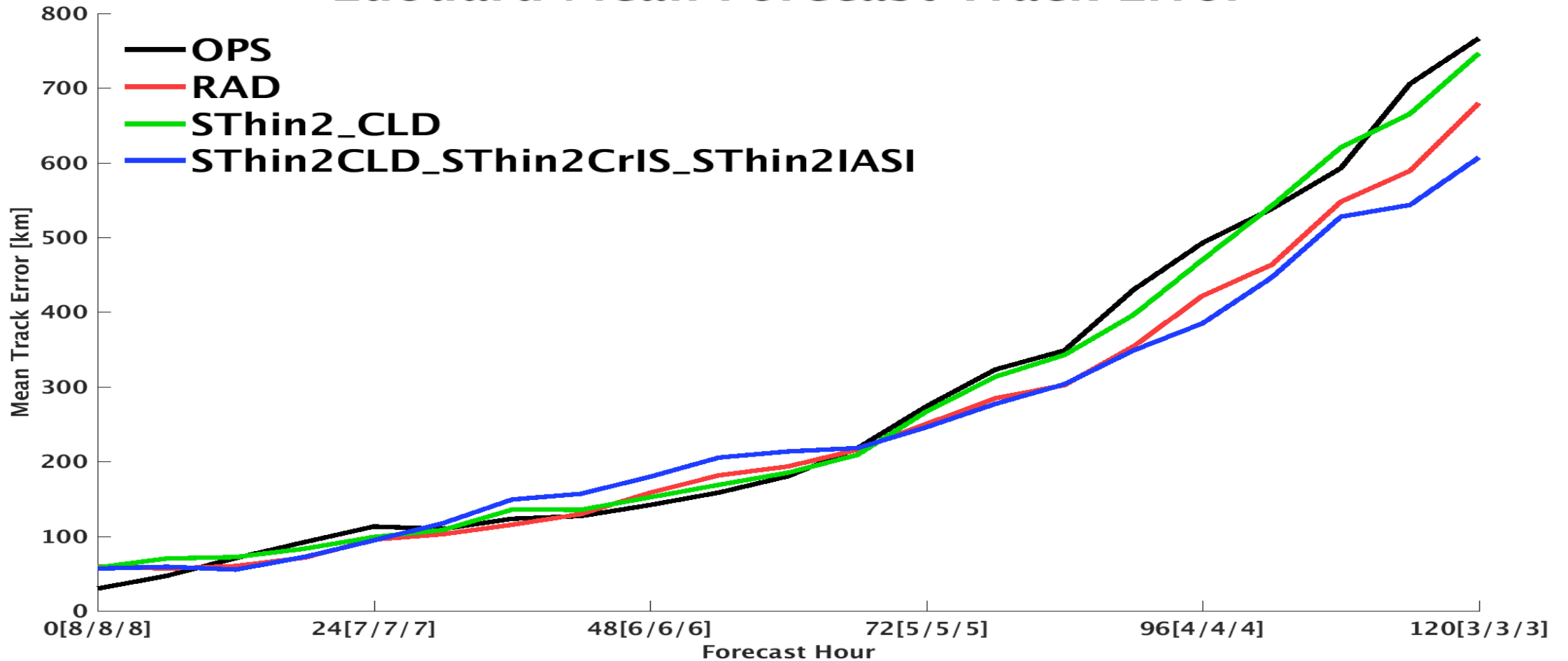
# Hurricane Edouard center pressure analysis



# Edouard 18Z17SEP2014

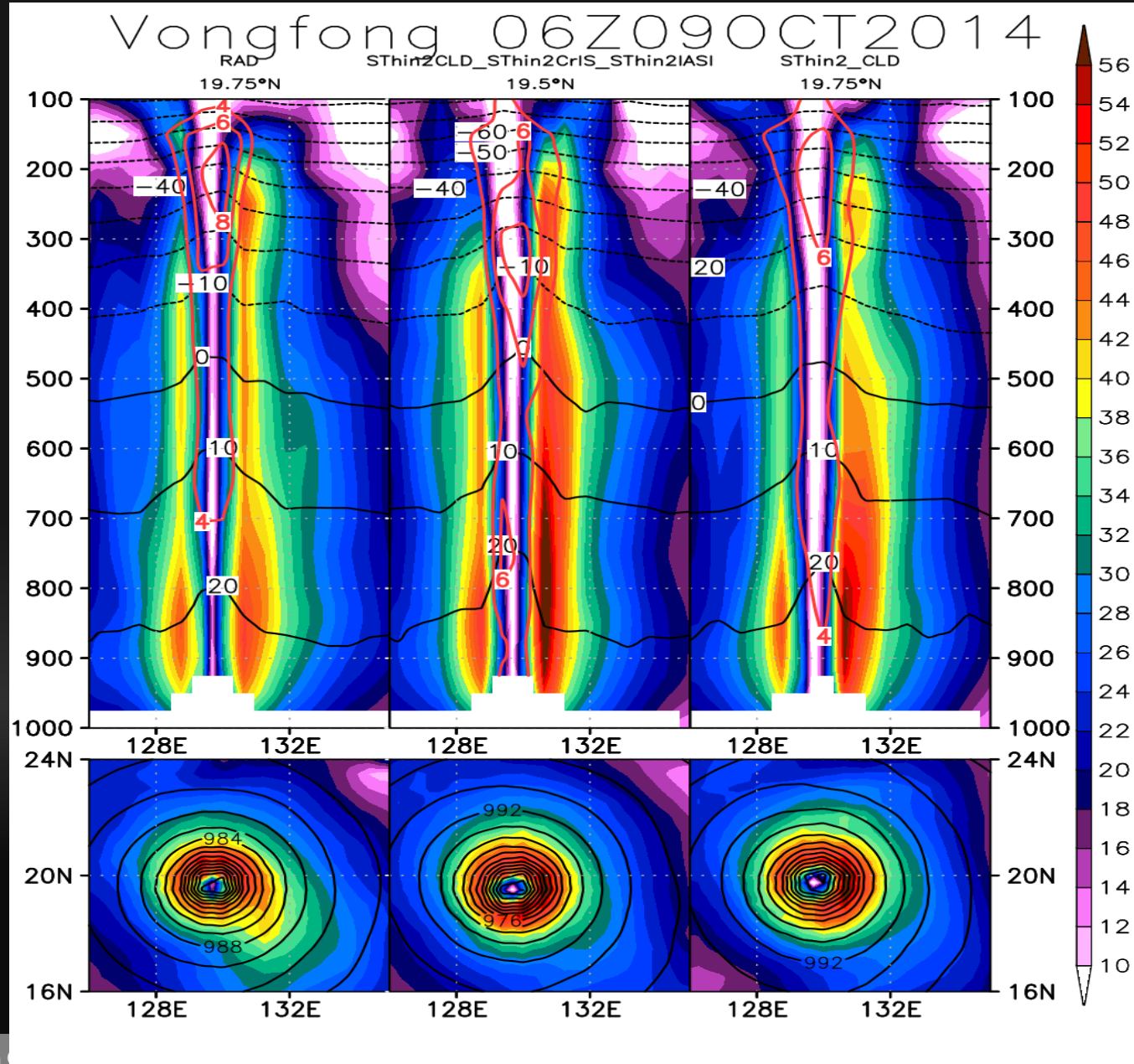


## Edouard Mean Forecast Track Error



Comprehensive adaptive thinning improves track forecast skill (unlike when applied to AIRS alone)

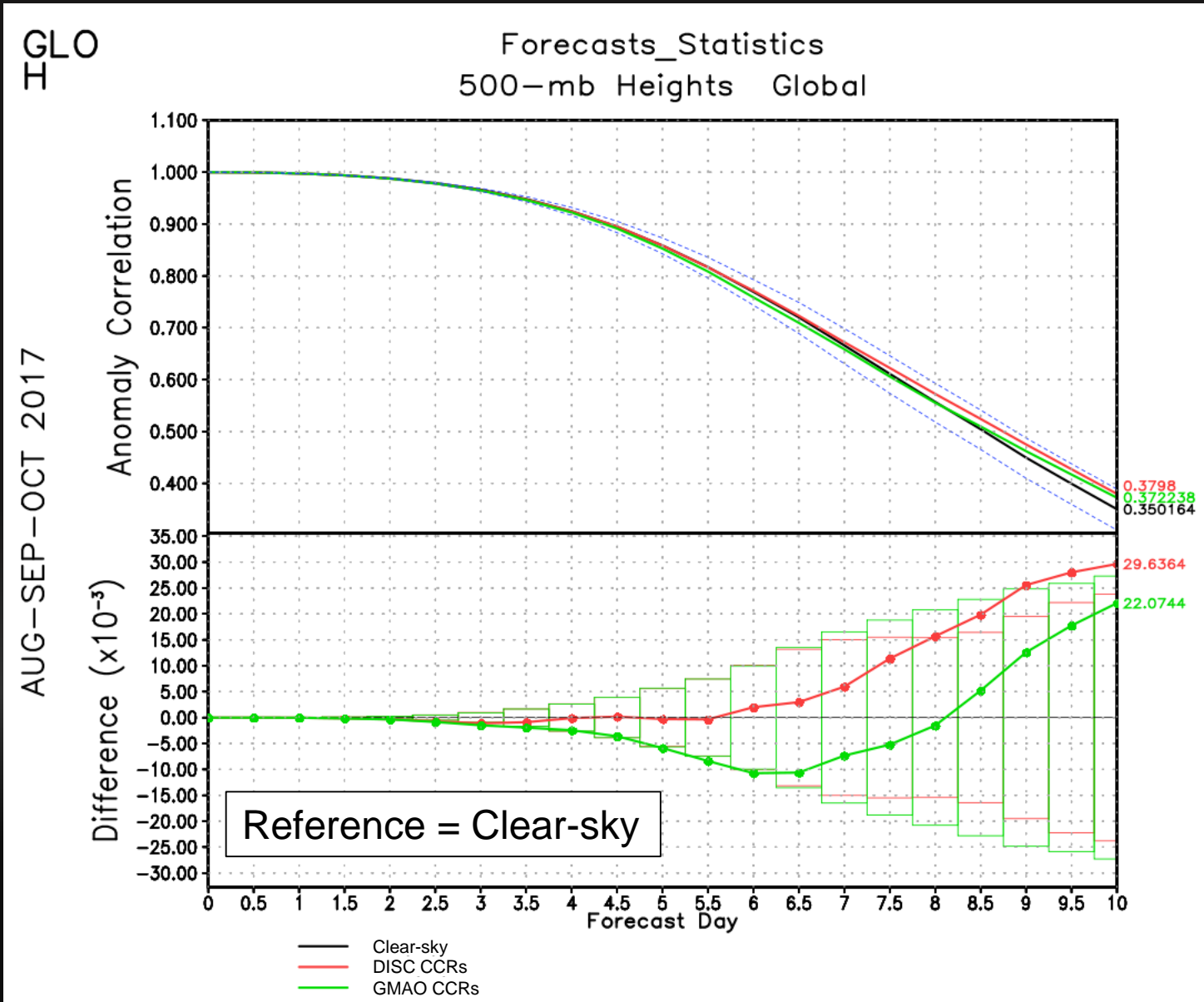
## Improvement in structure also for very large TCs



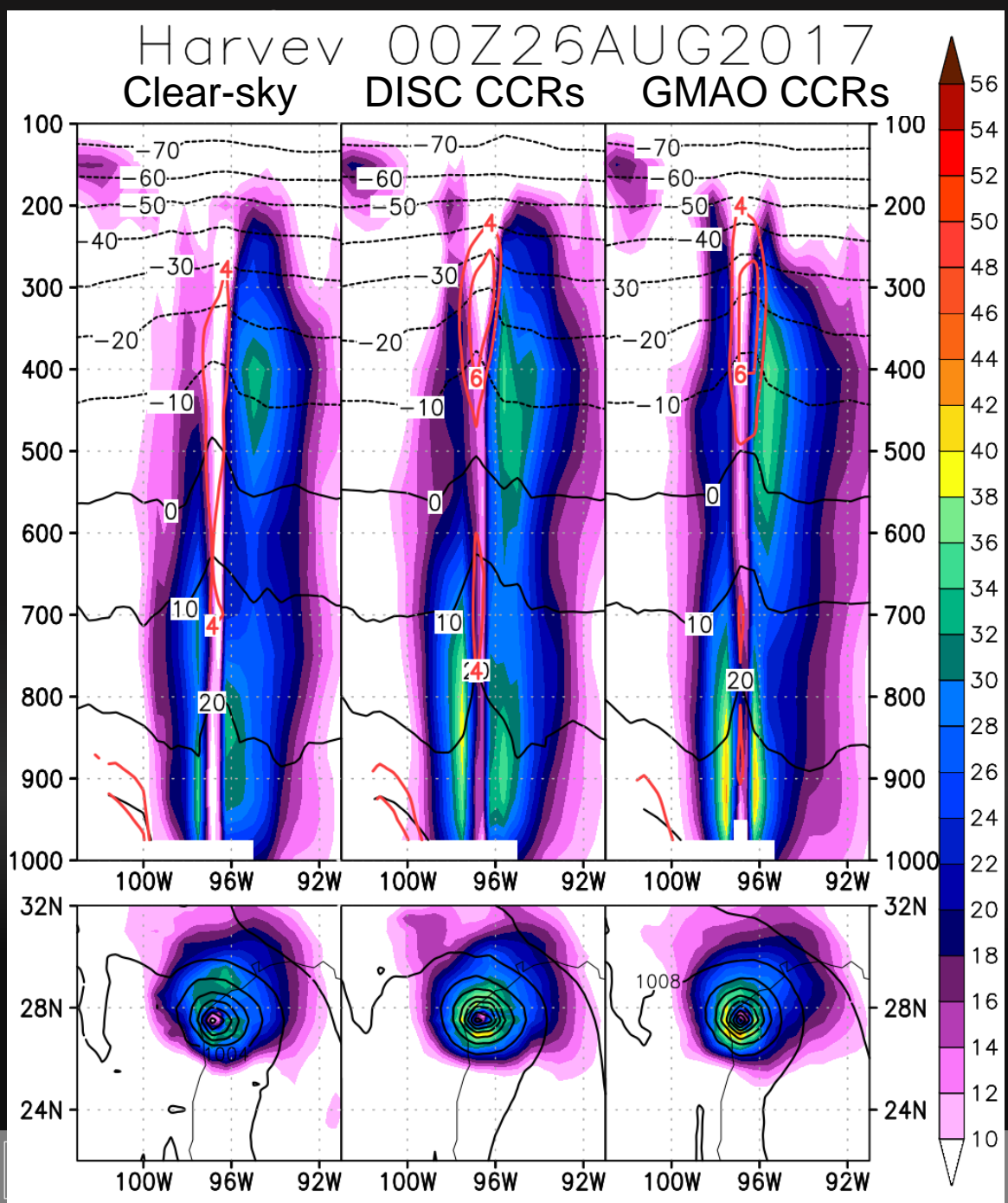
Extreme large typhoon, previously insensitive to changes in AIRS DA strategy, now positively impacted by combined adaptive thinning.

# Roadmap towards an operational use of CCRs

- In spite of the overwhelming evidence that cloud-cleared products are an immensely superior data type compared to clear-sky, cloud-cleared infrared radiances have not been operationally used because of: 1) **lack of awareness that CCRs need to be much more aggressively thinned**; 2) **latency**; and 3) **external dependencies** (ECMWF data; neural network) which are perceived by operational centers as not controllable
- As part of this plan, with the goal of raising awareness and interest towards cloud-cleared AIRS products, the cloud-clearing algorithm developed by **Joel Suskind** and his team was analyzed in the attempt of making it customizable (thanks to **Lena Iredell, Lou Kouvaris and John Blaisdell**)
- **Selection of channels changed** to match the one used by the **GMAO**
- **GEOS-originated fields** replace the neural network training against ECMWF
- **Revised algorithm ported to NCCS**
- **Produced CCRs** from July to October 2017
- Customized CCRs have been **successfully assimilated** in the new **hybrid 4DEnVAR GEOS** for the entire period

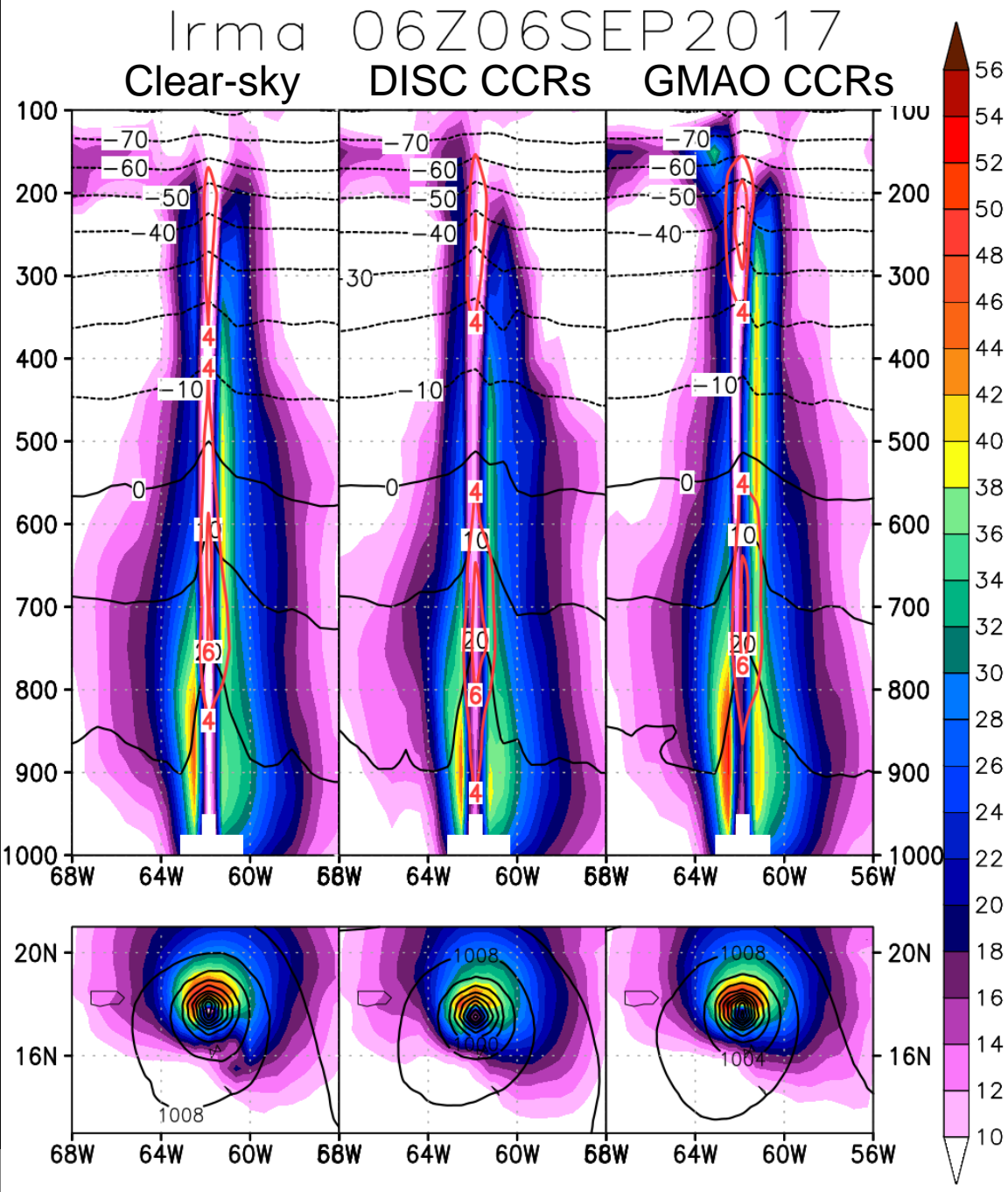


- The comparison of two AIRS CCR products (the one produced by the DAAC and the experimental one generated within the GMAO), reveals **no significant difference**
- This is the **first attempt ever** to create a GMAO-customized CCR product on NCCS and successfully assimilate it in the GEOS
- These preliminary results are very encouraging because they indicate the **feasibility of producing CCRs internally** without any external dependency and **controlling latency**



## • H. Harvey (2017)

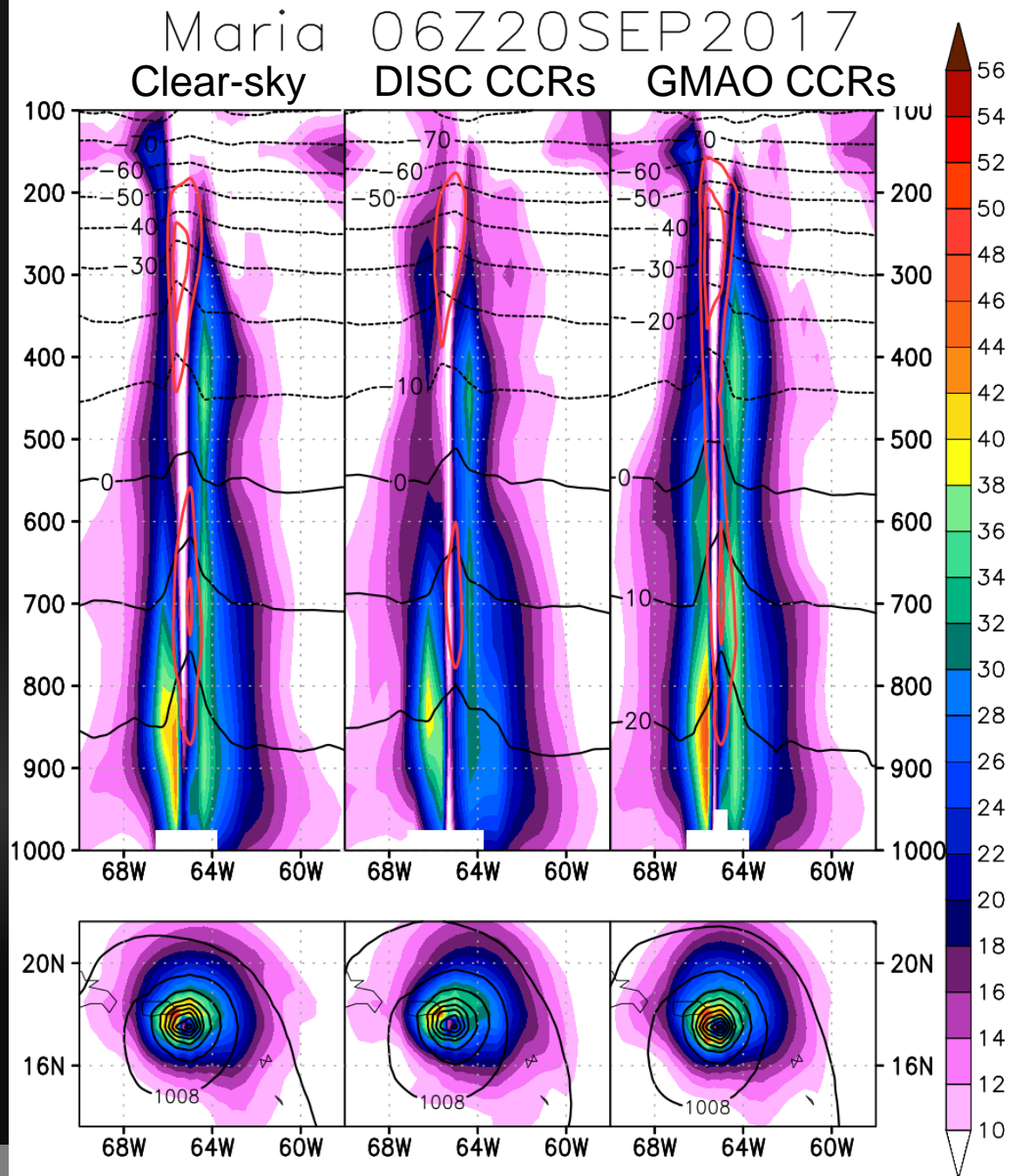
- Vertical cross section: Wind magnitude (shaded), Temperature ( $^{\circ}\text{C}$ , black), Temp. Anomaly ( $^{\circ}\text{C}$ , red)
- 850 hPa winds (shaded), slp (contours)
- Increased warm core structure, stronger wind speeds and lower sea level pressure and an overall improvement in vertical and horizontal structure result from assimilation of cloud-cleared AIRS radiances against clear-sky radiances
- The customized AIRS CCRs, tailored to the GMAO system, produce even better results



## • H. Irma (2017)

- Vertical cross section: Wind magnitude (shaded), Temperature ( $^{\circ}\text{C}$ , black), Temp. Anomaly ( $^{\circ}\text{C}$ , red)
- 850 hPa winds (shaded), slp (contours)
- The assimilation of customized CCRs brings improvements in Irma's structure: stronger low-level winds and more compact eye





## • H. Maria (2017)

- Vertical cross section: Wind magnitude (shaded), Temperature ( $^{\circ}\text{C}$ , black), Temp. Anomaly ( $^{\circ}\text{C}$ , red)
- 850 hPa winds (shaded), slp (contours)
- Similar result with Maria, the customized cloud-clearing adapted to the GEOS is capable of improving the vertical and horizontal structure of the storm

# Conclusions and future work

- Long progress since first experiments with retrievals more than a decade ago
- Demonstrated **value** of **adaptively thinned AIRS cloud-cleared radiances**
- Expanding the concept towards other sensors
- Comprehensive adaptive thinning strategy that consistently modifies the density of assimilated radiances for ***all hyperspectral instruments together*** (combining **Cloud-clear AIRS, with clear-sky adaptively thinned CrIS and IASI**) proves to be very promising
- Demonstrated **customizability of cloud-cleared radiances**
- Next 2 talks: hybrid 4DEnVAR (Erica), Polar lows (Manisha)

**Future work: CrIS and IASI cloud-cleared radiances**

# Acknowledgements



**Tsengdar Lee** for current support through grant 80NSSC18K0927 “Using AIRS and CrIS data to understand processes affecting TC structure in a Global Data Assimilation and Forecasting Framework (2018-2021)” (PI: O. Reale)

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**Amal El Akkraoui**, **Matt Thompson** and **Ben Auer** for help with the GEOS

**GES DISC** for their outstanding service to the community

## **AIRS-related articles published by this team**

**Reale, O., J. Susskind, R. Rosenberg, E. Brin, E. Liu, L. P. Riishojgaard, J. Terry, J. C. Jusem, 2008: Improving forecast skill by assimilation of quality-controlled AIRS temperature retrievals under partially cloudy conditions. *Geophysical Research Letters*, 35, L08809, doi:10.1029/2007GL033002.**

**Reale, O., W. K. Lau, J. Susskind, E. Brin, E. Liu, L. P. Riishojgaard, M. Fuentes, R. Rosenberg, 2009: AIRS Impact on the Analysis and Forecast Track of Tropical Cyclone Nargis in a global data assimilation and forecasting system. *Geophysical Research Letters*, 36, L06812, doi:10.1029/2008GL037122.**

**Reale, O., W. K. Lau, K.-M. Kim, E. Brin, 2009: Atlantic tropical cyclogenetic processes during SOP-3 NAMMA in the GEOS-5 global data assimilation and forecast system. *Journal of the Atmospheric Sciences*, 66, 3563-3578.**

**Reale, O., K. M. Lau, J. Susskind, and R. Rosenberg, 2012: AIRS impact on analysis and forecast of an extreme rainfall event (Indus River Valley, Pakistan, 2010) with a global data assimilation and forecast system, *J. Geophys. Res.*, 117, D08103, doi:10.1029/2011JD017093.**

**Reale, O., E. McGrath-Spangler, W. McCarty, D. Holdaway, R. Gelaro, 2018: Impact of adaptively thinned AIRS cloud-cleared radiances on tropical cyclone representation in a global data assimilation and forecast system. *Weather and Forecasting*, 33, 908-931.**