



Progress and Plans for the Environmental Modeling Center's (EMC) Gridpoint Statistical Interpolation (GSI) Development

Andrew Collard, Daryl Keist, David Parrish, Ed Safford, Emily Liu, Manuel Pondeva, Miodrag Rancic, Lidia Cucurull, Haixia Liu, Xu Li, XiuJuan Su, Shun Liu, Wan-Shu Wu, Paul van Delst, Yanqiu Zhu, Mingjing Tong, David Groff, Ho-Chun Huang, Mike Lueken, George Gayno, Min-Jeong Kim, Runhua Yang, Yoichiro Ota, Jim Purser, Russ Treadon, and John Derber

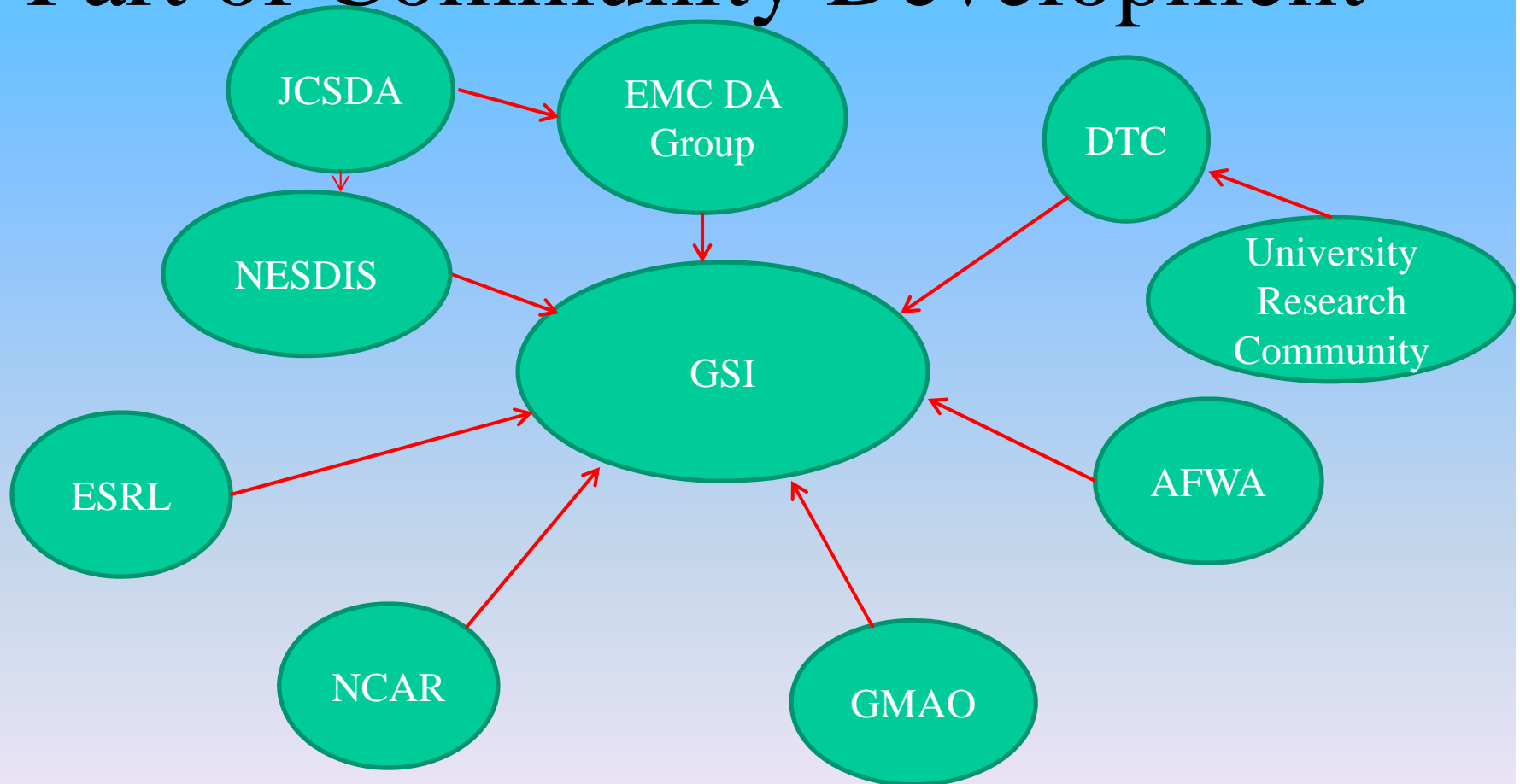


Outline

- Community Development
- Ongoing EMC Development
 - Assimilation techniques
 - Use of Observations
 - Maintenance, Collaboration and General Improvements
- Future EMC Directions



Part of Community Development





Community development

- Major change for EMC DA Team to move into community development
- Tool for community development has been subversion and trac
- Requires change in how we do work with significant increase in communication among developers
 - Also requires changes in partners way of doing work – often more difficult
 - However EMC cannot count on community for critical changes since we have operational responsibility
- GSI oversight board
 - Improve communication among groups
 - Ensure coding standards are followed
- Substantial percentage of the EMC DA Team's time is used in supporting community.
- Most of the GSI updates come from EMC.



Assimilation techniques

- **Hybrid**
 - Implementation of Hybrid/3dvar-EnKF for Global – David Parrish, Russ Treadon, Mike Lueken, Daryl Kleist, Jeff Whittaker (ESRL)
 - Hybrid for NAM – Wan-shu Wu
 - Hybrid for HWRF – Mingjing Tong
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- 4d-Var – Misha Rancic
- Constraint
 - Add surface friction, mixing, precip and cloud physics to strong constraint – Min-Jeong Kim, Misha Rancic, Daryl Kleist
 - Regional Strong Constraint – David Parrish
- GSI Aerosol assimilation – Ho-Chun Huang
- Inclusion of NSST capability – Xu Li
- **Cloudy Radiance Assimilation – Min-Jeong Kim, Emily Liu, Yanqiu Zhu, Will McCarty (GMAO)**



Implementation of Hybrid/3dvar- EnKF

David Parrish, Russ Treadon, Mike Lueken, Daryl Kleist, Jeff Whittaker
(ESRL), Yoichiro Ota (JMA)

- Current background error covariance (applied operationally) in VAR
 - Isotropic recursive filters
 - Poor handle on cross-variable covariance
 - Minimal flow-dependence added
 - Implicit flow-dependence through linearization in normal mode constraint (Kleist et al. 2009)
 - Flow-dependent variances (only for wind, temperature, and pressure) based on background tendencies
 - Tuned NMC-based estimate (lagged forecast pairs)
- Other changes part of hybrid package



EnKF/3DVar hybrid

$$J_{\text{Var}}(\mathbf{x}') = \frac{1}{2}(\mathbf{x}')^T \mathbf{B}_{\text{Var}}^{-1}(\mathbf{x}') + \frac{1}{2}(\mathbf{y}'_o - \mathbf{H}\mathbf{x}')^T \mathbf{R}^{-1}(\mathbf{y}'_o - \mathbf{H}\mathbf{x}') + J_c$$

J : Penalty (Fit to background + Fit to observations + Constraints)

\mathbf{x}' : Analysis increment ($x_a - x_b$) ; where x_b is a background

\mathbf{B}_{Var} : Background error covariance

\mathbf{H} : Observations (forward) operator

\mathbf{R} : Observation error covariance (Instrument + representativeness)

\mathbf{y}'_o : Observation innovations

J_c : Constraints (physical quantities, balance/noise, etc.)

\mathbf{B} is typically static and estimated a-priori/offline

Hybrid Variational-Ensemble

- Incorporate ensemble perturbations directly into variational cost function through extended control variable
 - Lorenc (2003), Buehner (2005), Wang et. al. (2007), etc.

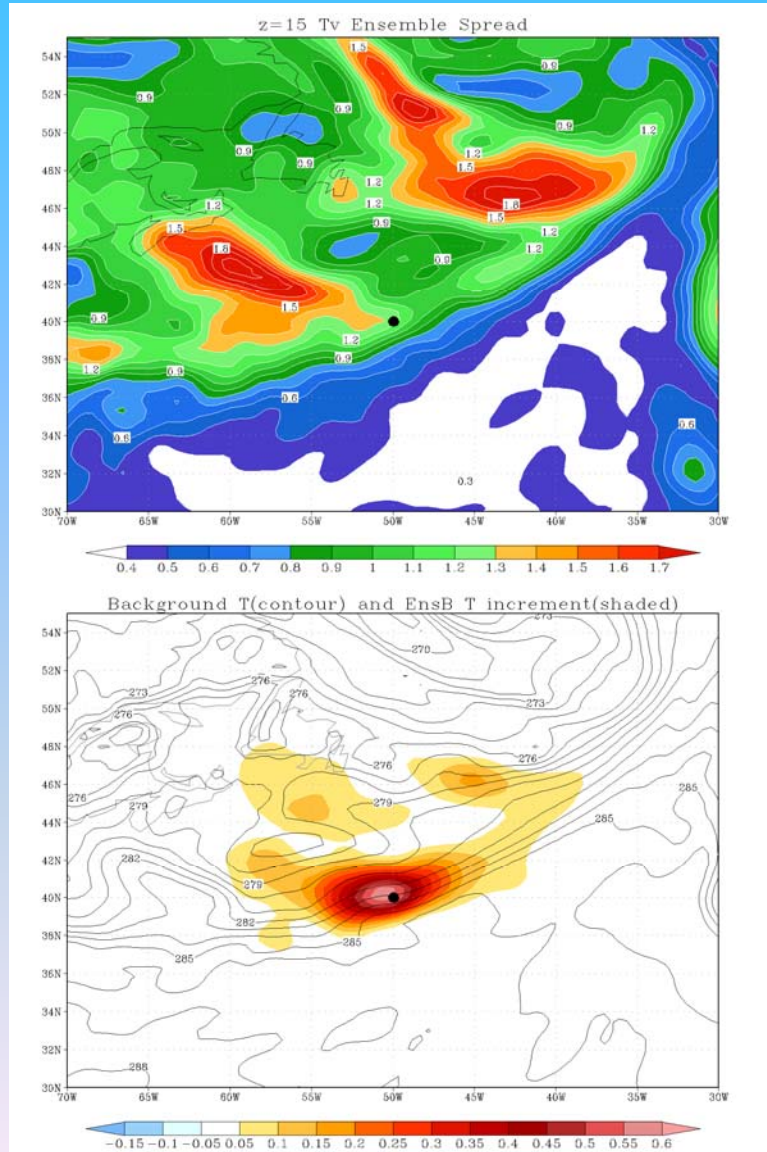
$$J(\mathbf{x}'_f, \alpha) = \beta_f \frac{1}{2} (\mathbf{x}'_f)^T \mathbf{B}^{-1} (\mathbf{x}'_f) + \beta_e \frac{1}{2} (\alpha)^T \mathbf{L}^{-1} (\alpha) + \frac{1}{2} (\mathbf{y}'_o - \mathbf{H}\mathbf{x}'_t)^T \mathbf{R}^{-1} (\mathbf{y}'_o - \mathbf{H}\mathbf{x}'_t)$$

$$\mathbf{x}'_t = \mathbf{x}'_f + \sum_{k=1}^K (\alpha_k \circ \mathbf{x}_k^e)$$

$$\frac{1}{\beta_f} + \frac{1}{\beta_e} = 1$$

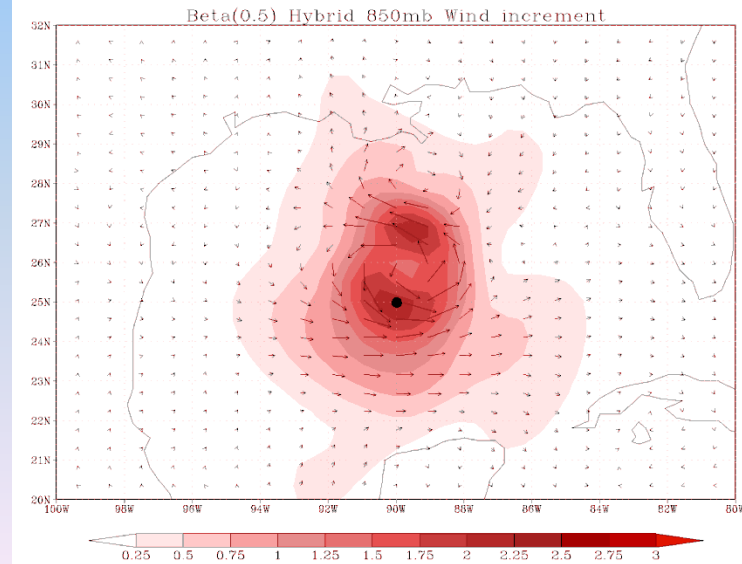
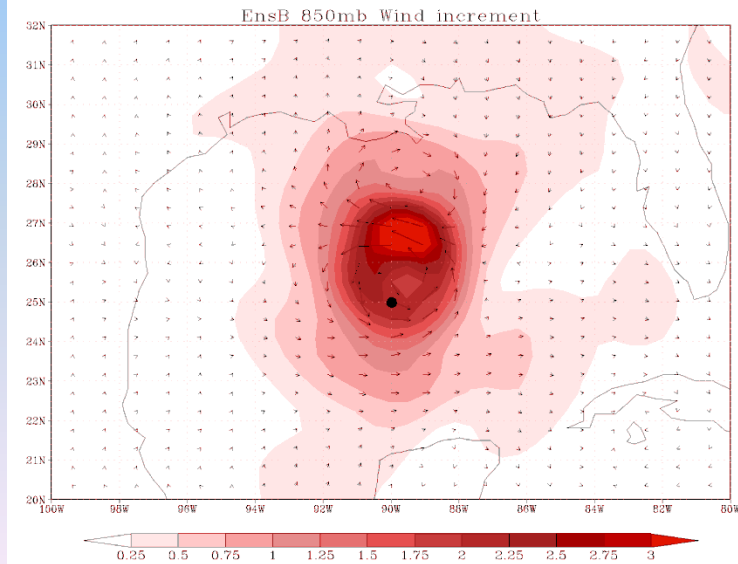
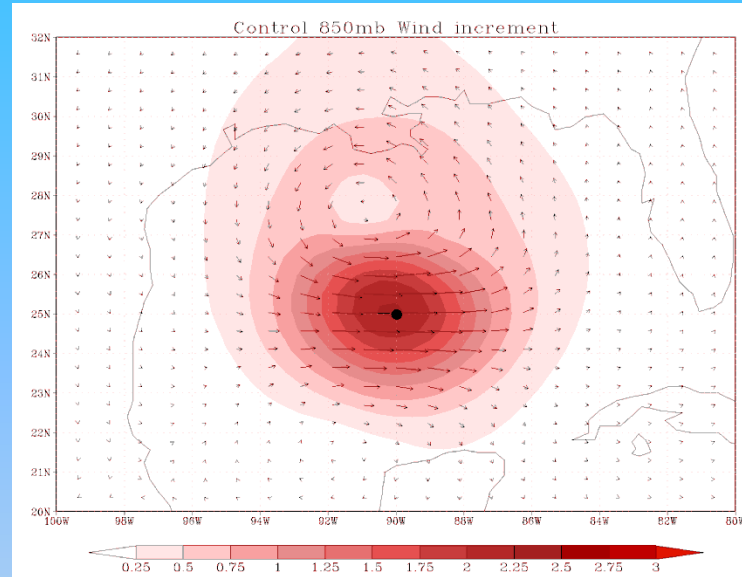
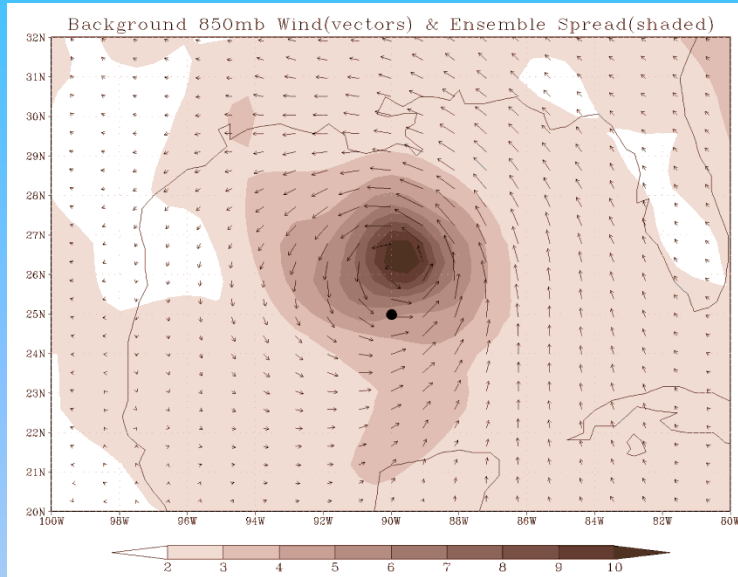
β_f & β_e : weighting coefficients for fixed and ensemble covariance respectively
 \mathbf{x}'_t : (total increment) sum of increment from fixed/static \mathbf{B} (\mathbf{x}'_f) and ensemble \mathbf{B}
 α_k : extended control variable; \mathbf{x}_k^e : ensemble perturbation
 \mathbf{L} : correlation matrix [localization on ensemble perturbations]

Single Observation



Single 850mb Tv observation (1K O-F, 1K error)

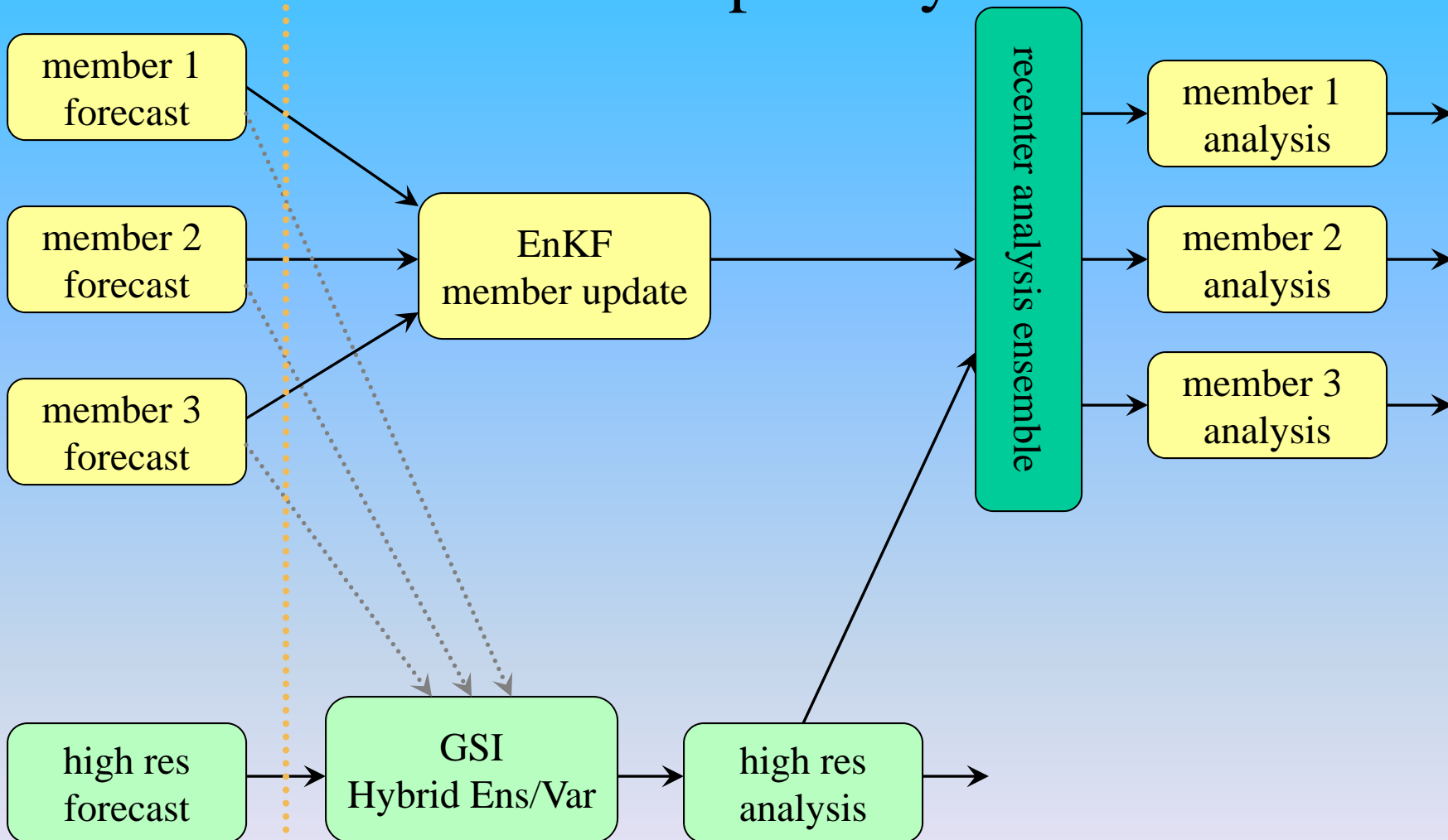
Single Observation



Single 850mb zonal wind observation (3 m/s O-F, 1m/s error) in Hurricane Ike circulation

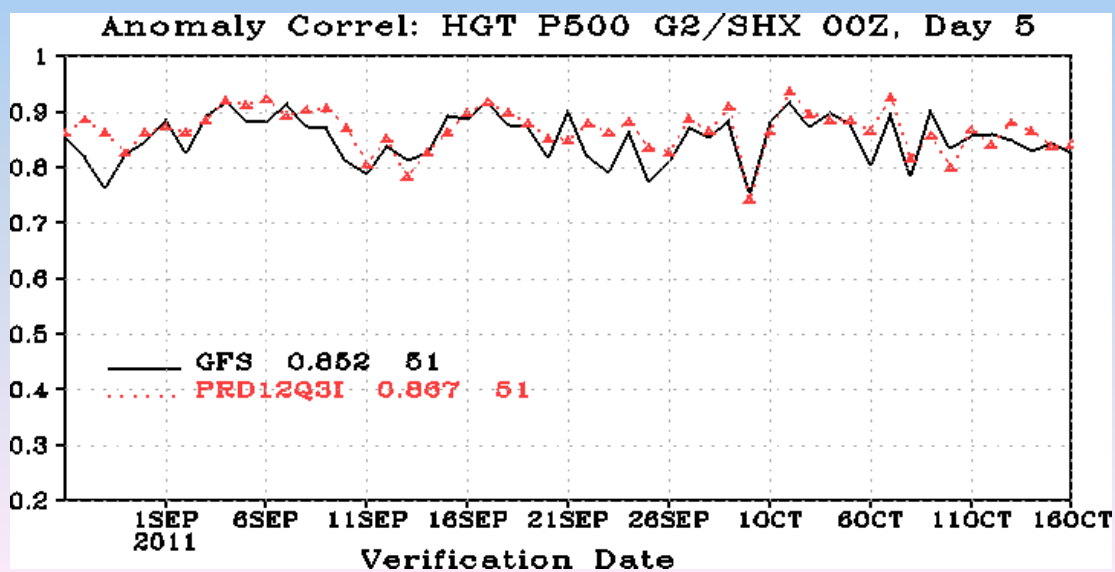
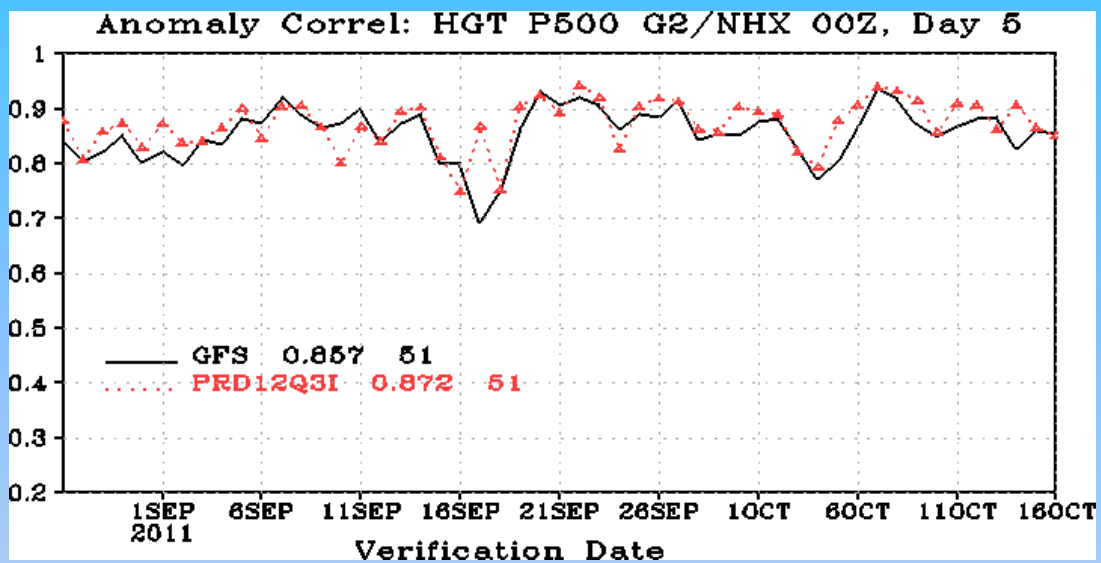


Dual-Res Coupled Hybrid



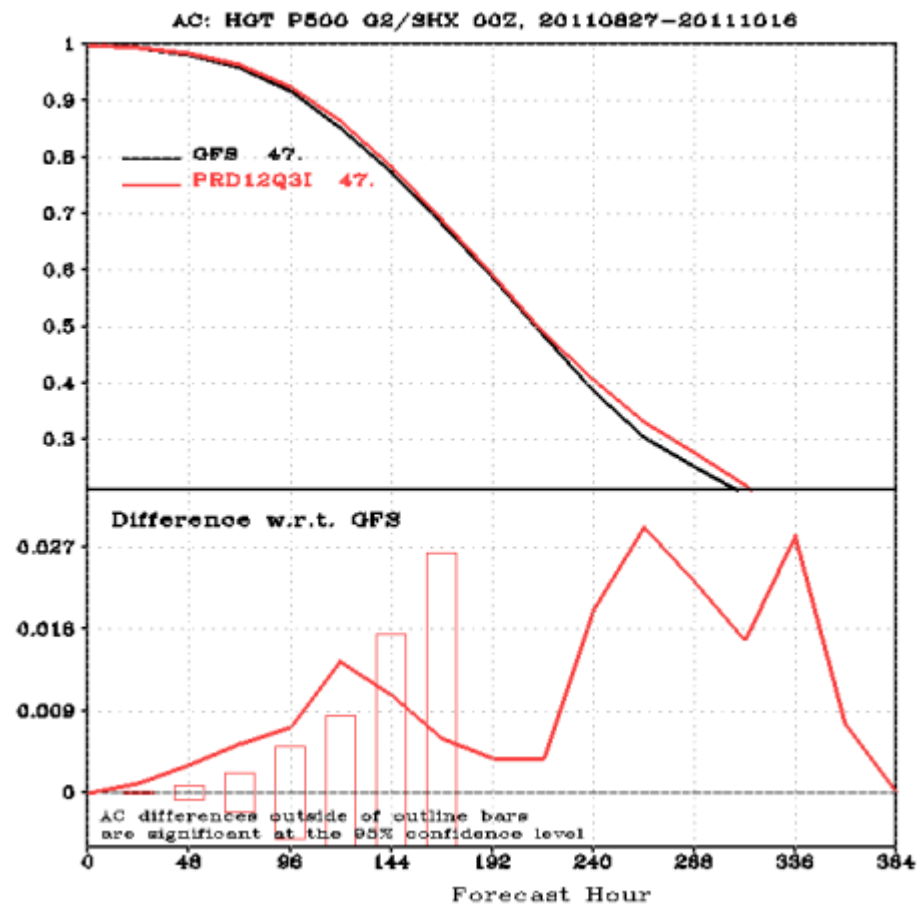
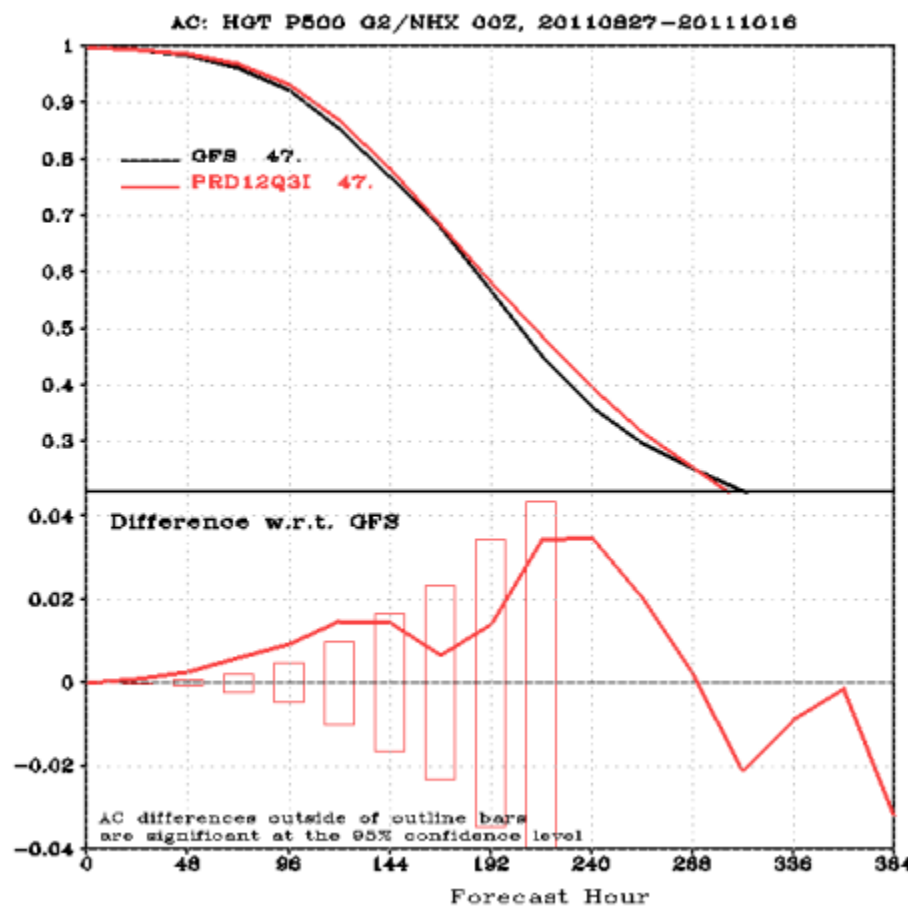
Previous Cycle

Current Update Cycle



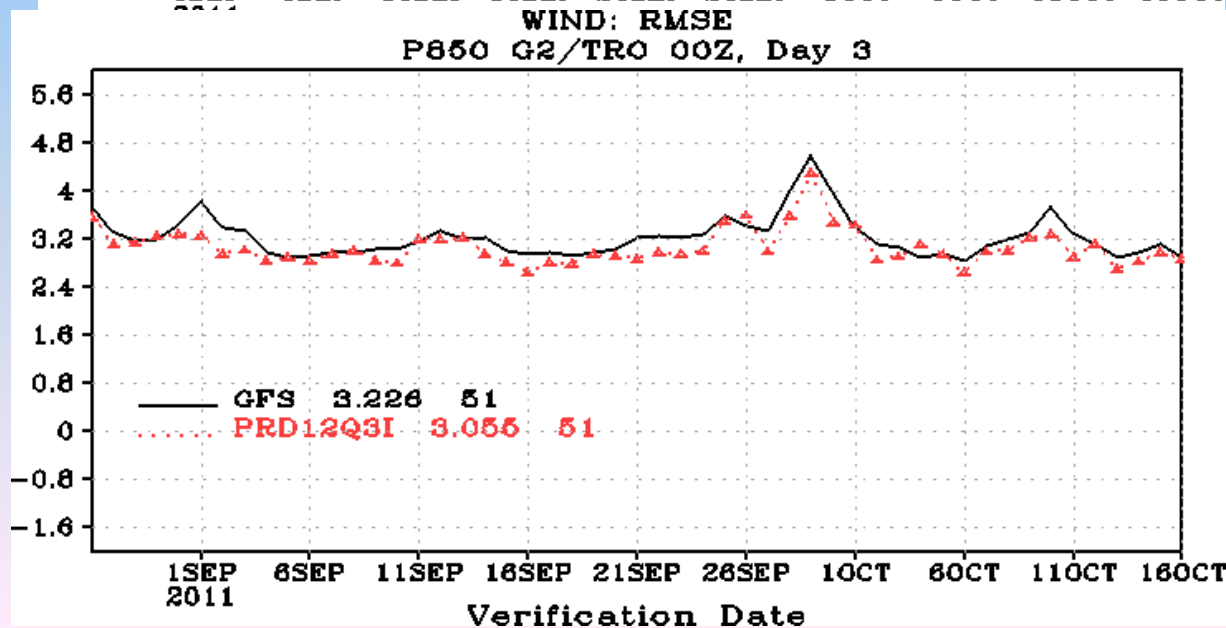
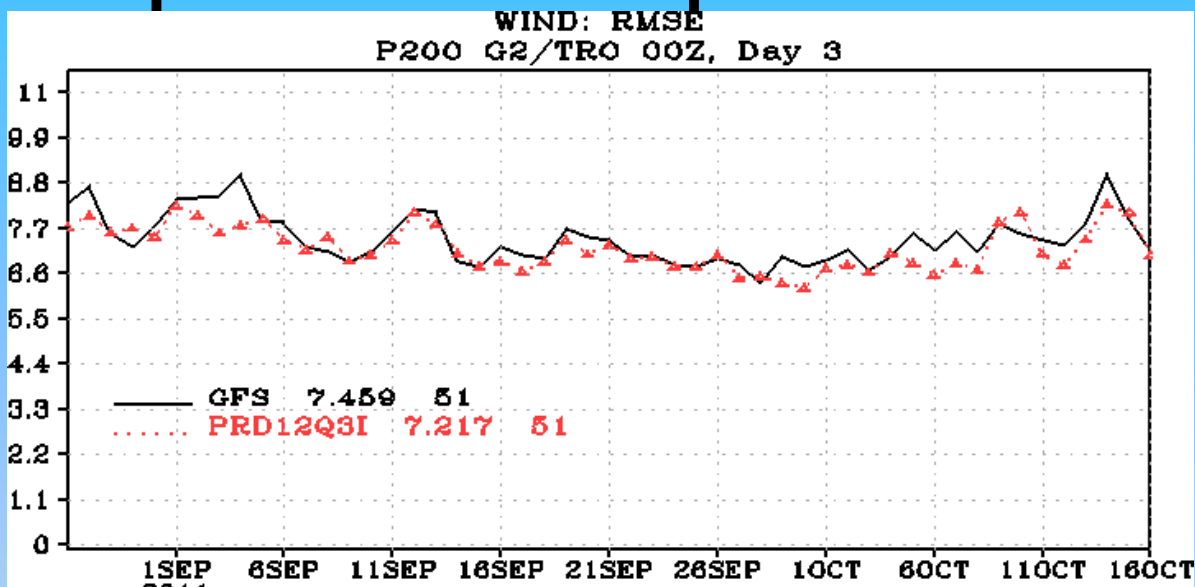


Retrospective Die-off curves

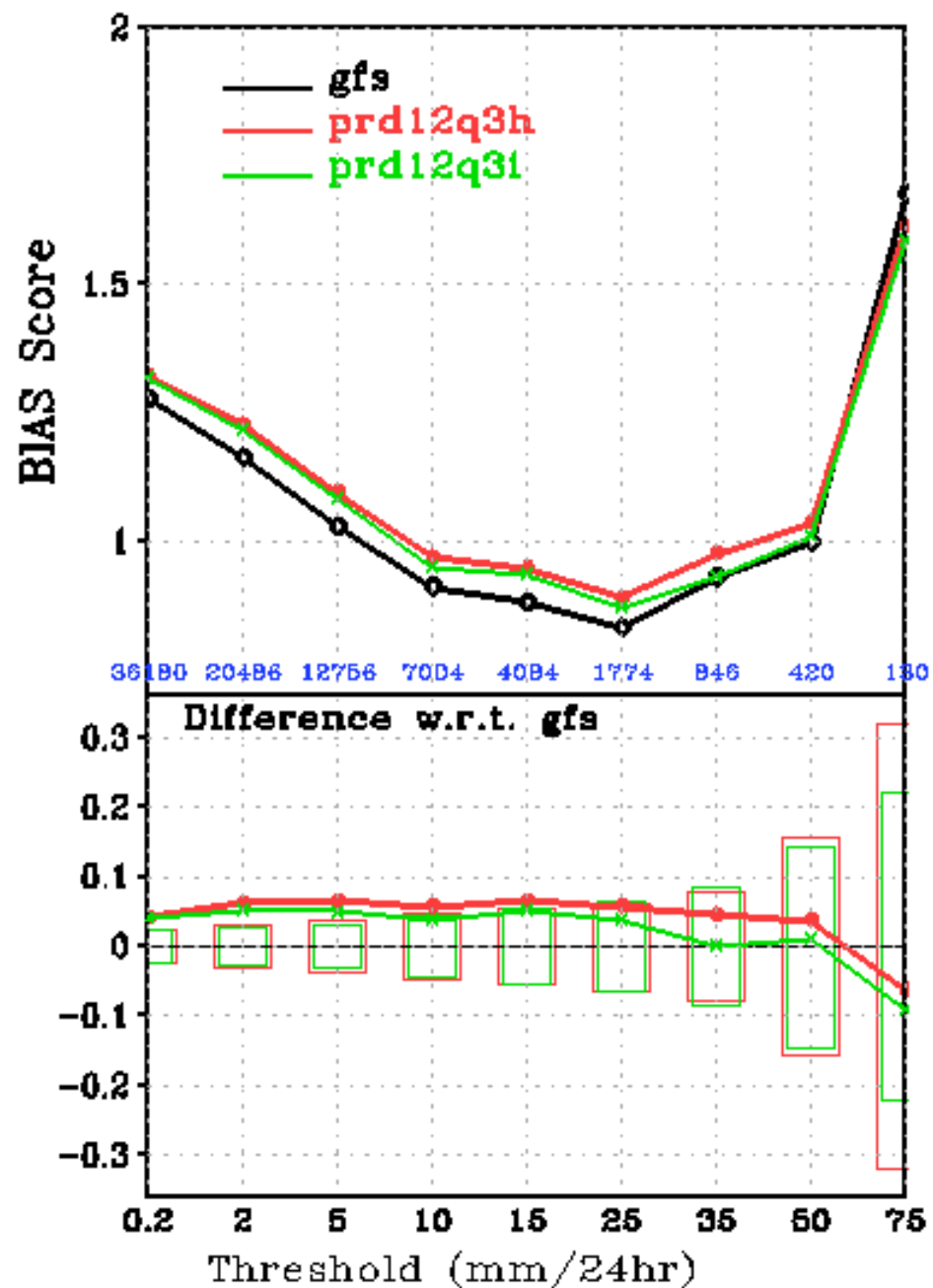
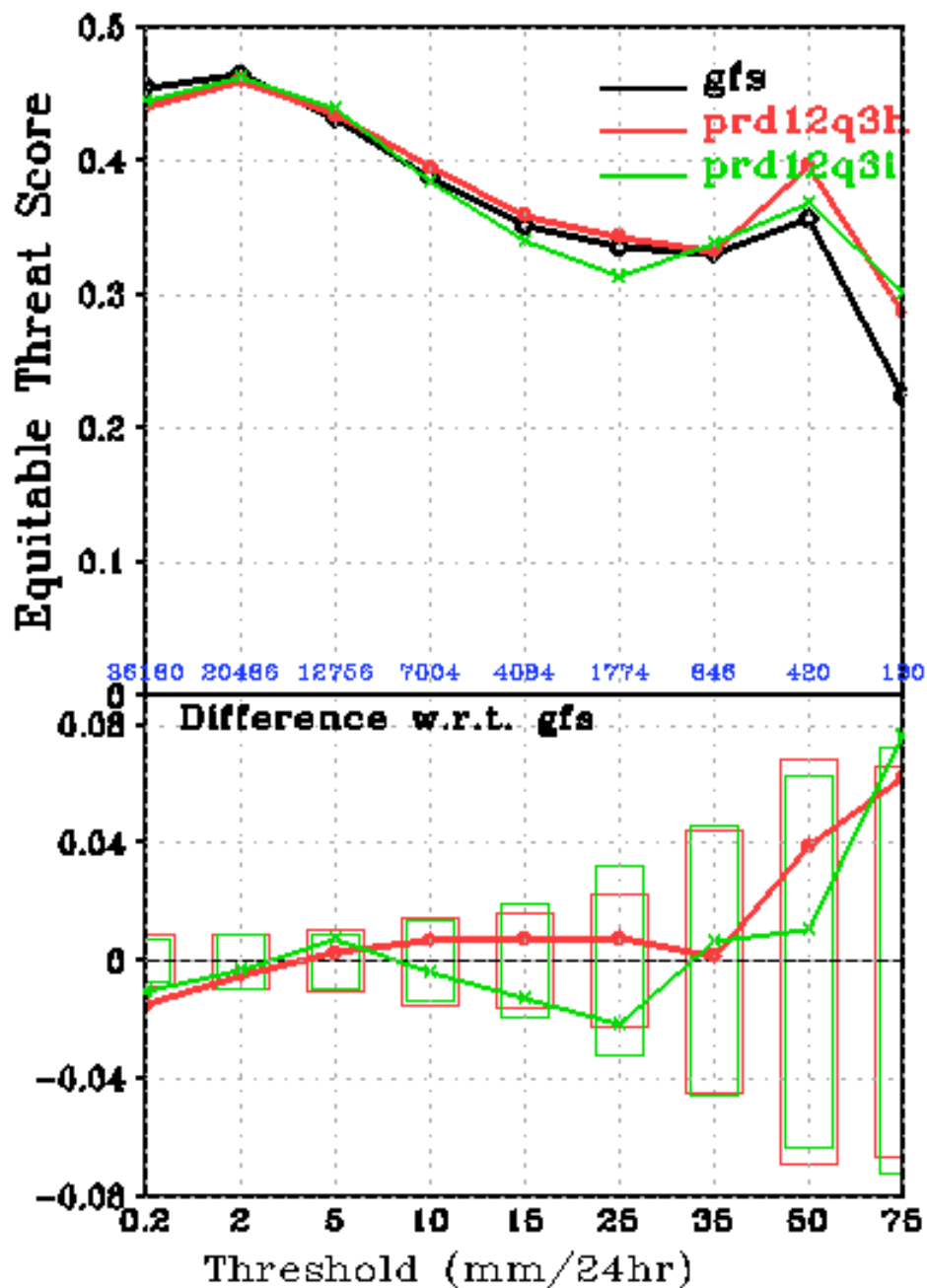




Retrospective Tropical Winds

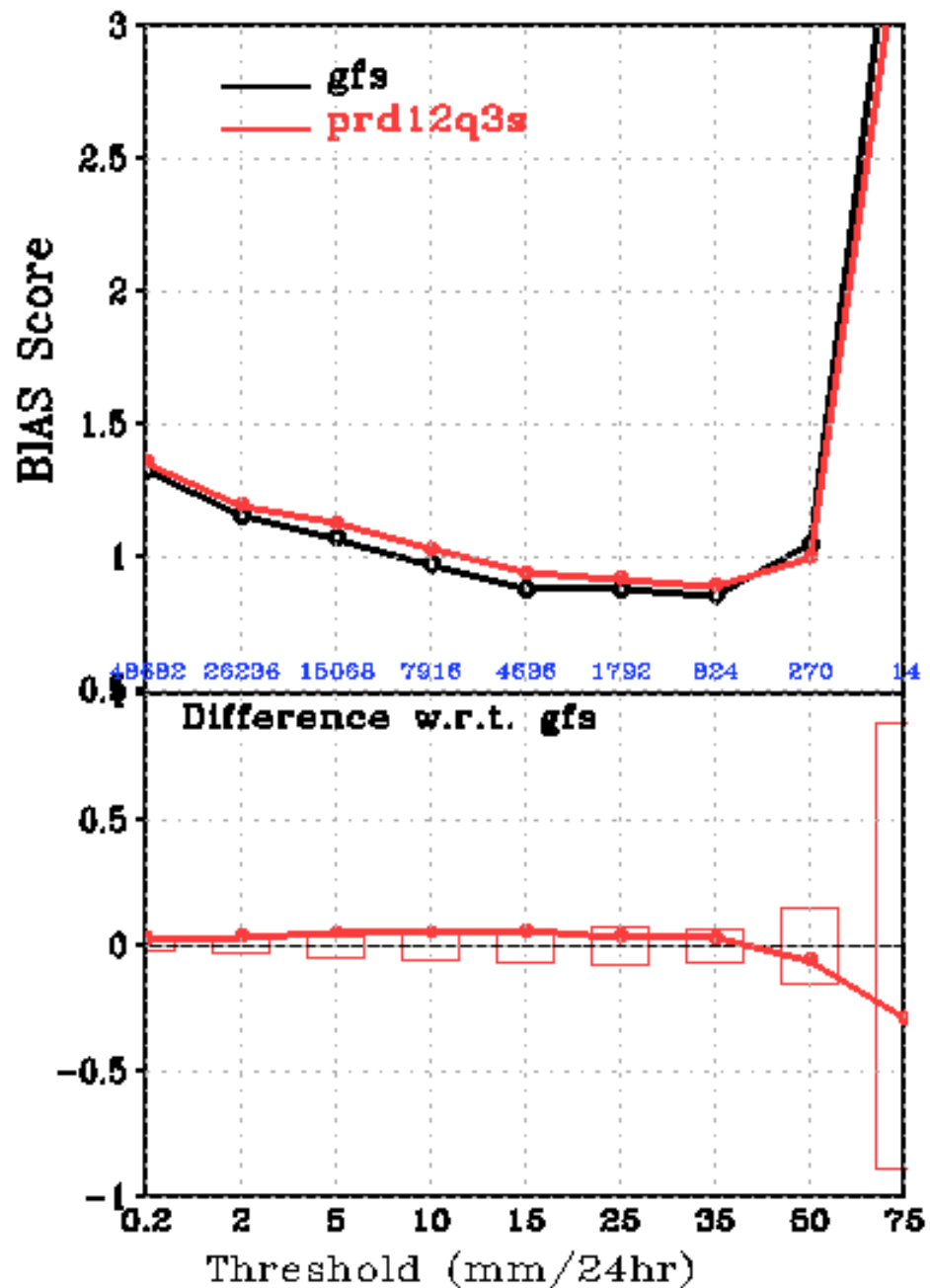
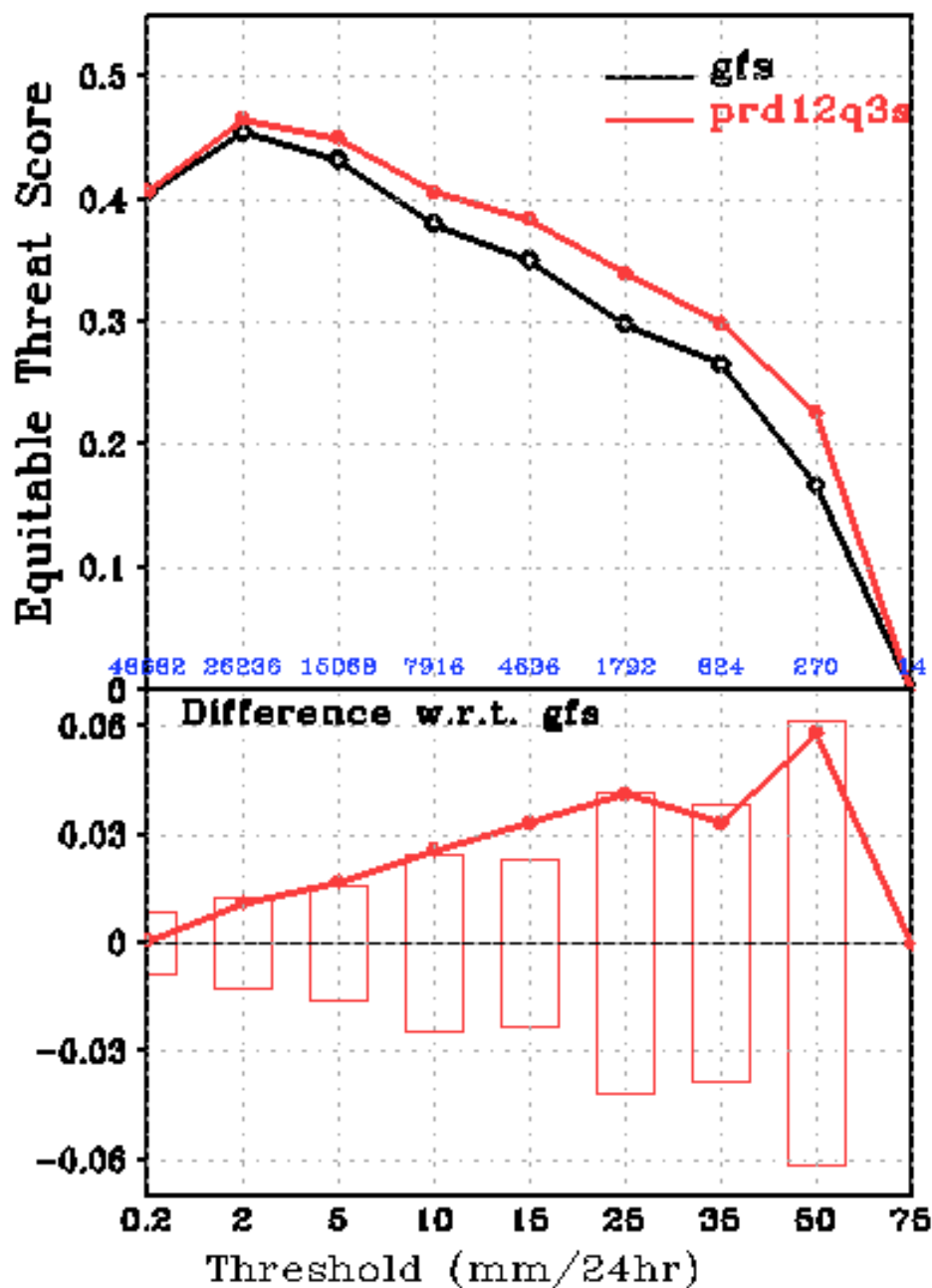


CONUS Precip Skill Scores, f12-f36, 27aug2011-16oct2011



Differences outside of the hollow bars are 95% significant based on 10000 Monte Carlo Tests

CONUS Precip Skill Scores, f36-f60, 08jan2012-10mar2012

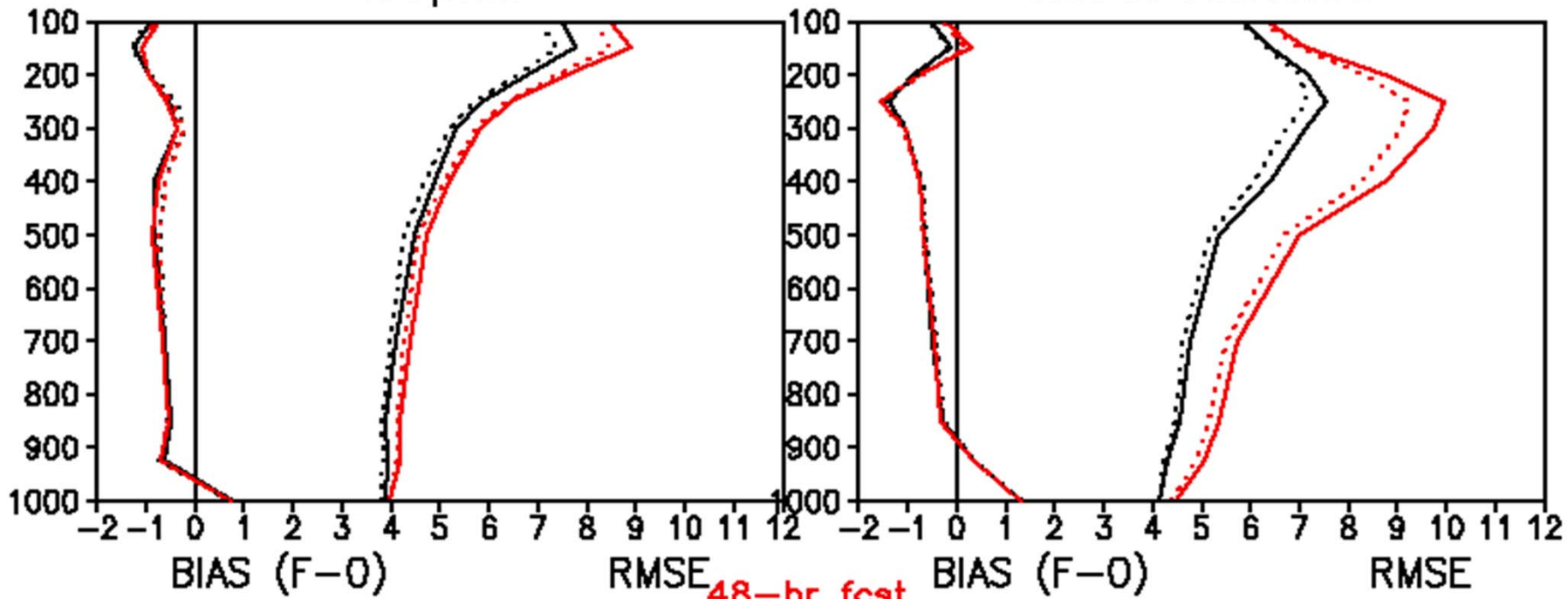
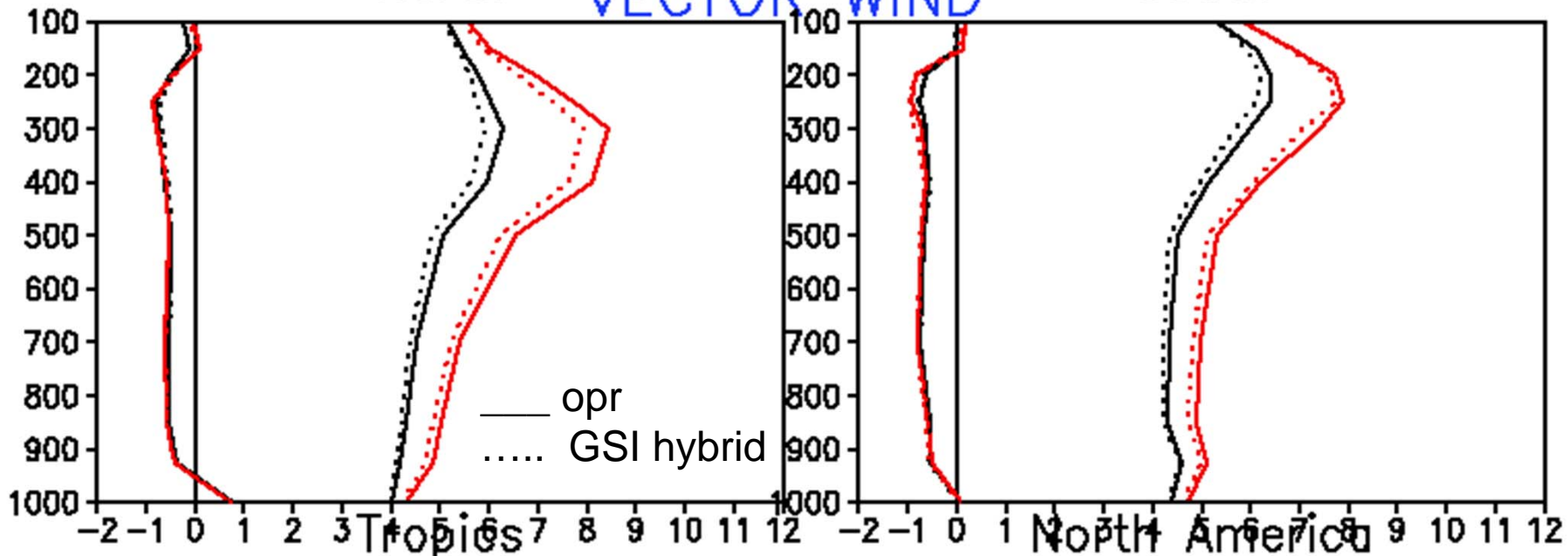


Differences outside of the hollow bars are 95% significant based on 10000 Monte Carlo Tests

North

VECTOR WIND

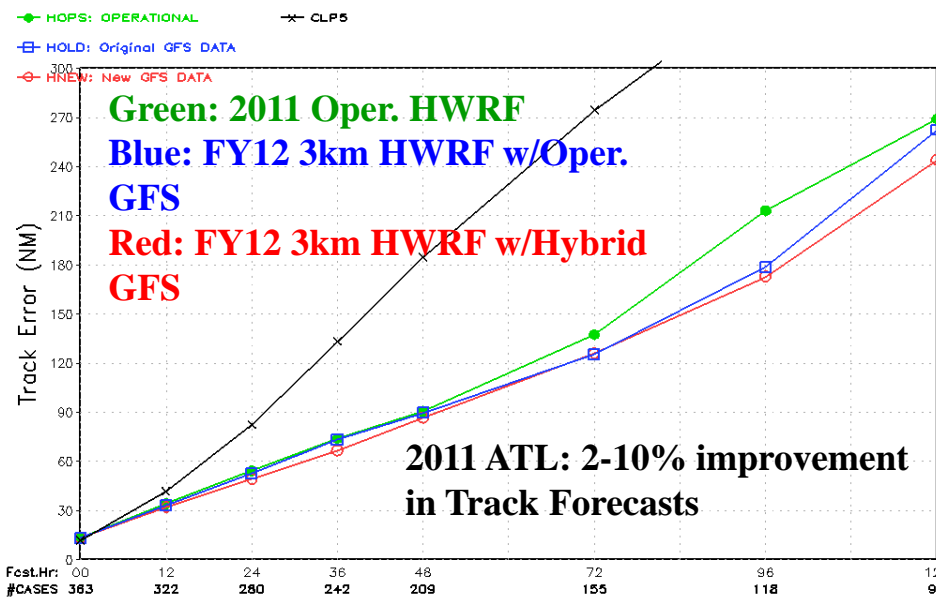
South



48-hr fcst
24-hr fcst

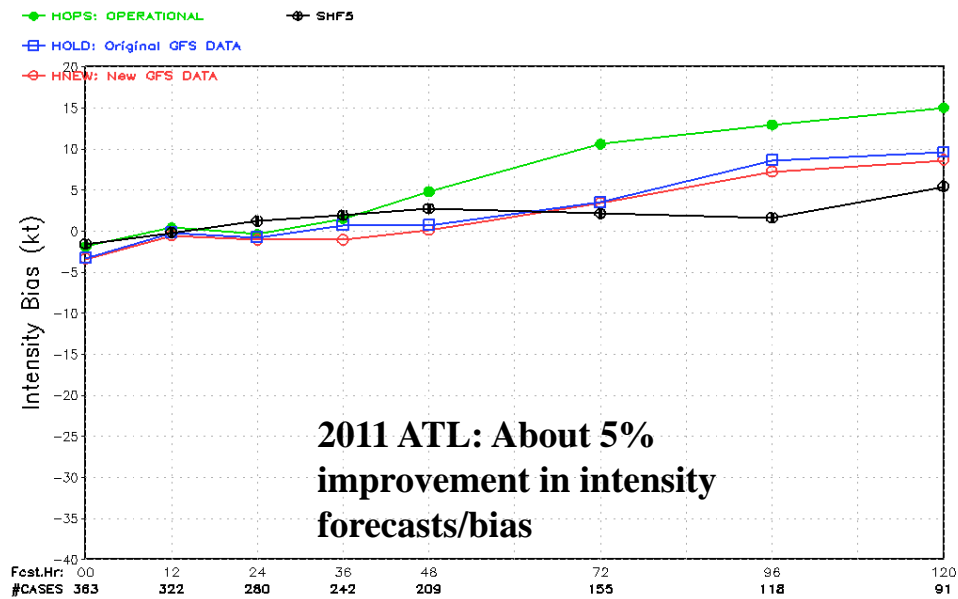
00z08jan2012 - 00z11mar2012

Average Track Errors (NM)
Statistics Plots - 2011 Atlantic Storms



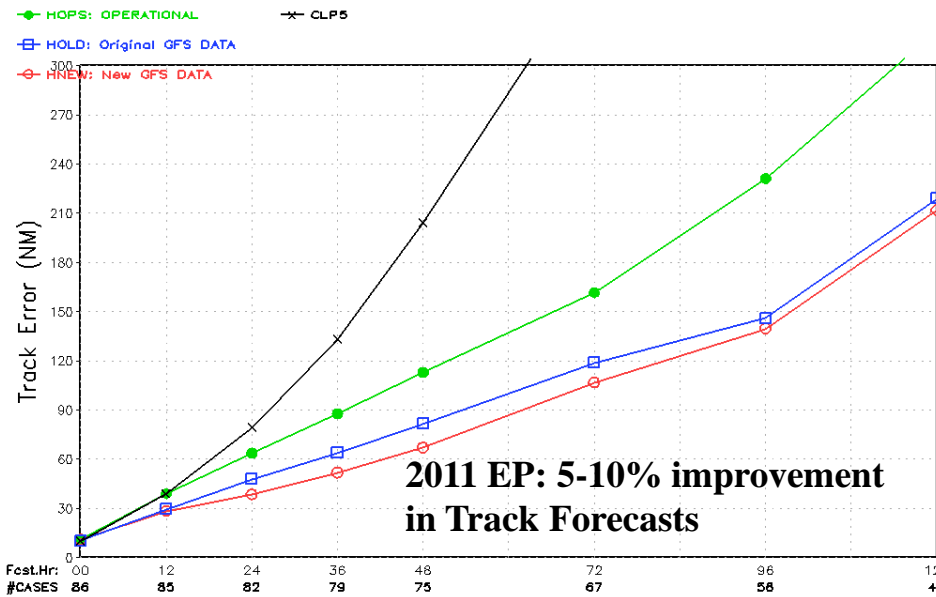
NCEP Hurricane Forecast Project

Intensity Bias (kt)
Statistics Plots - 2011 Atlantic Storms



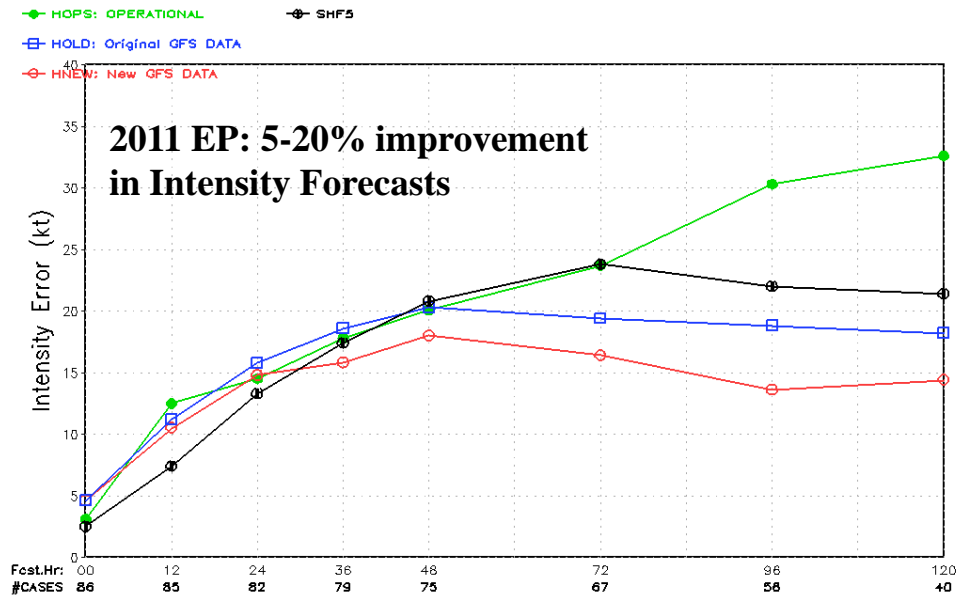
NCEP Hurricane Forecast Project

Average Track Errors (NM)
Statistics Plots - 2011 E. Pacific Storms



NCEP Hurricane Forecast Project

Average Intensity Errors (kt)
Statistics Plots - 2011 E. Pacific Storms

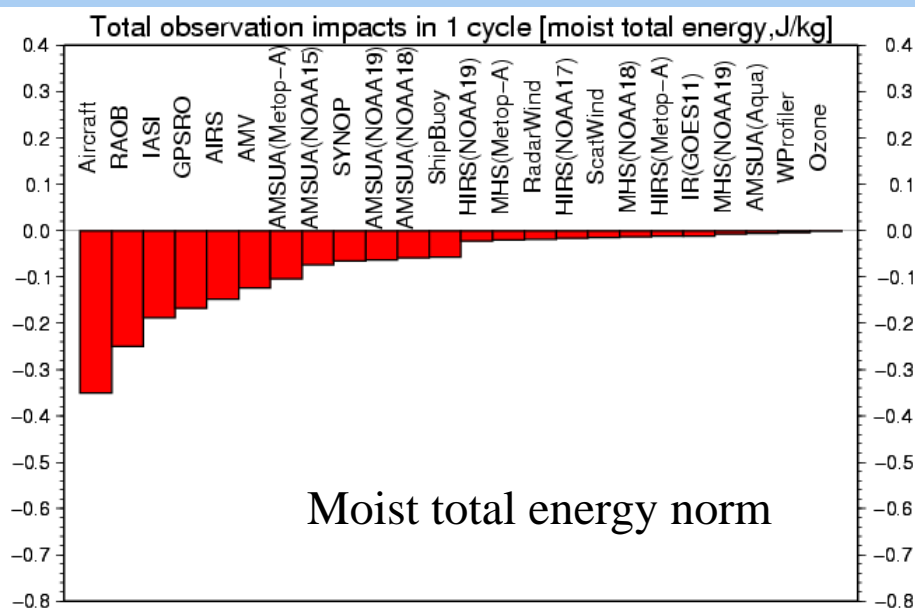
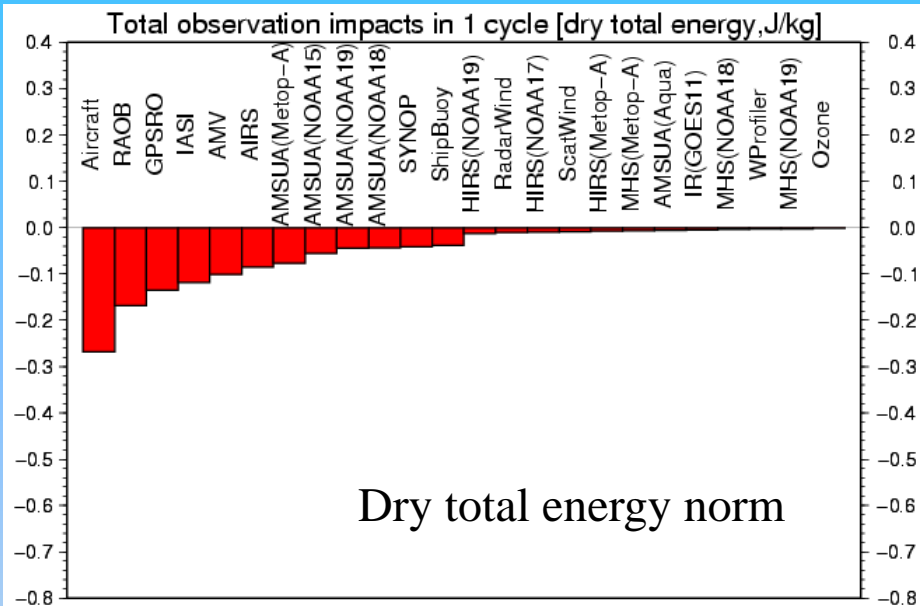
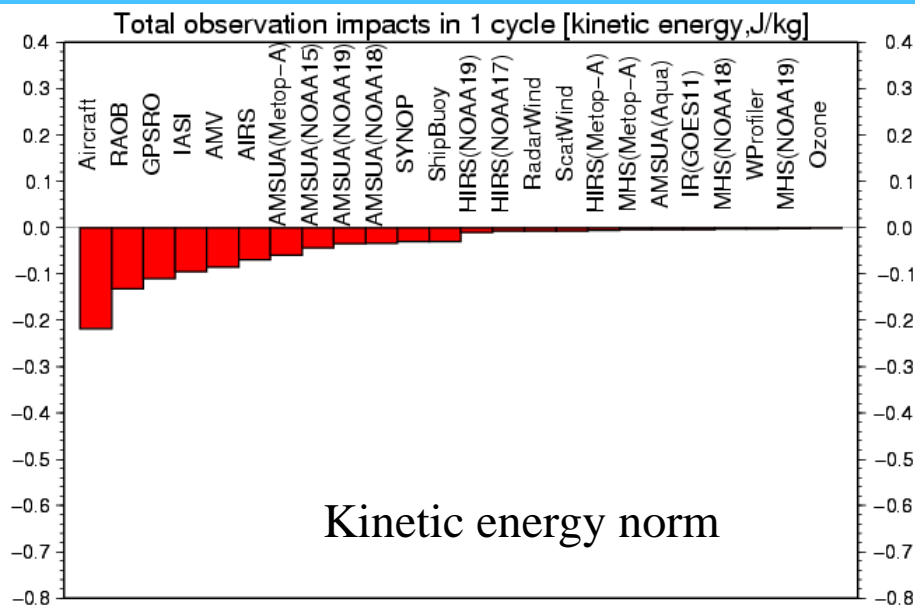


NCEP Hurricane Forecast Project

HVEDAS Extensions and Improvements

- Expand hybrid to 4D
 - Hybrid within ‘traditional 4DVAR’ (with adjoint)
 - Pure ensemble 4DVAR (non-adjoint)
- EnKF improvements
 - Explore alternatives such as LETKF
 - Adaptive localization and inflation
- Non-GFS applications in development
 - NAM /Mesoscale Modeling
 - Hurricanes/HWRF
 - Storm-scale initialization
 - Rapid Refresh
 - Other global models (NASA GEOS-5, NOAA FIM)
- NCEP strives to have single DA system to develop, maintain, and run operationally (global, mesoscale, severe weather, hurricanes, etc.)
 - *GSI (including hybrid development) is community code*
 - EnKF used for GFS-based hybrid being expanded for use with other applications (not yet supported by DTC)
- Observation impacts and sensitivity, Yoichiro Ota

Observation impacts with various norms



Average total observation impacts of various observation types.

From 12UTC October 21 2010 to 06UTC October 28 2010 (28 cases).

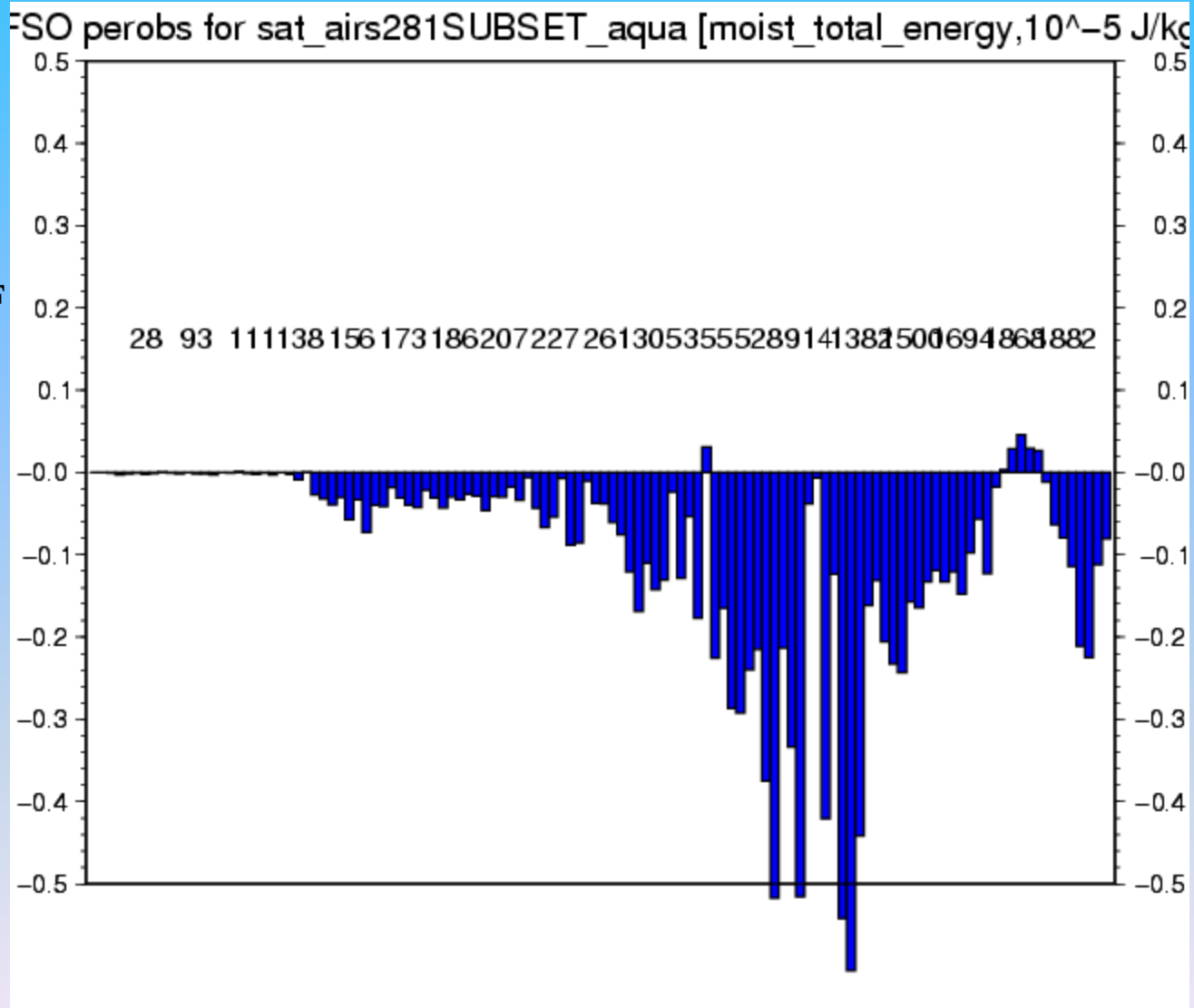
Evaluation FT is 24 hours. Impacts are estimated with the serial EnSRF and simple horizontal advection of localization function.

Serial EnSRF

Impact per 1 obs: AIRS moist total energy

Serial EnSRF
at the same
analysis time

292219





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Cloudy Radiance Assimilation

Min-Jeong Kim, Emily Liu, Yanqiu Zhu, Will McCarty (GMAO)

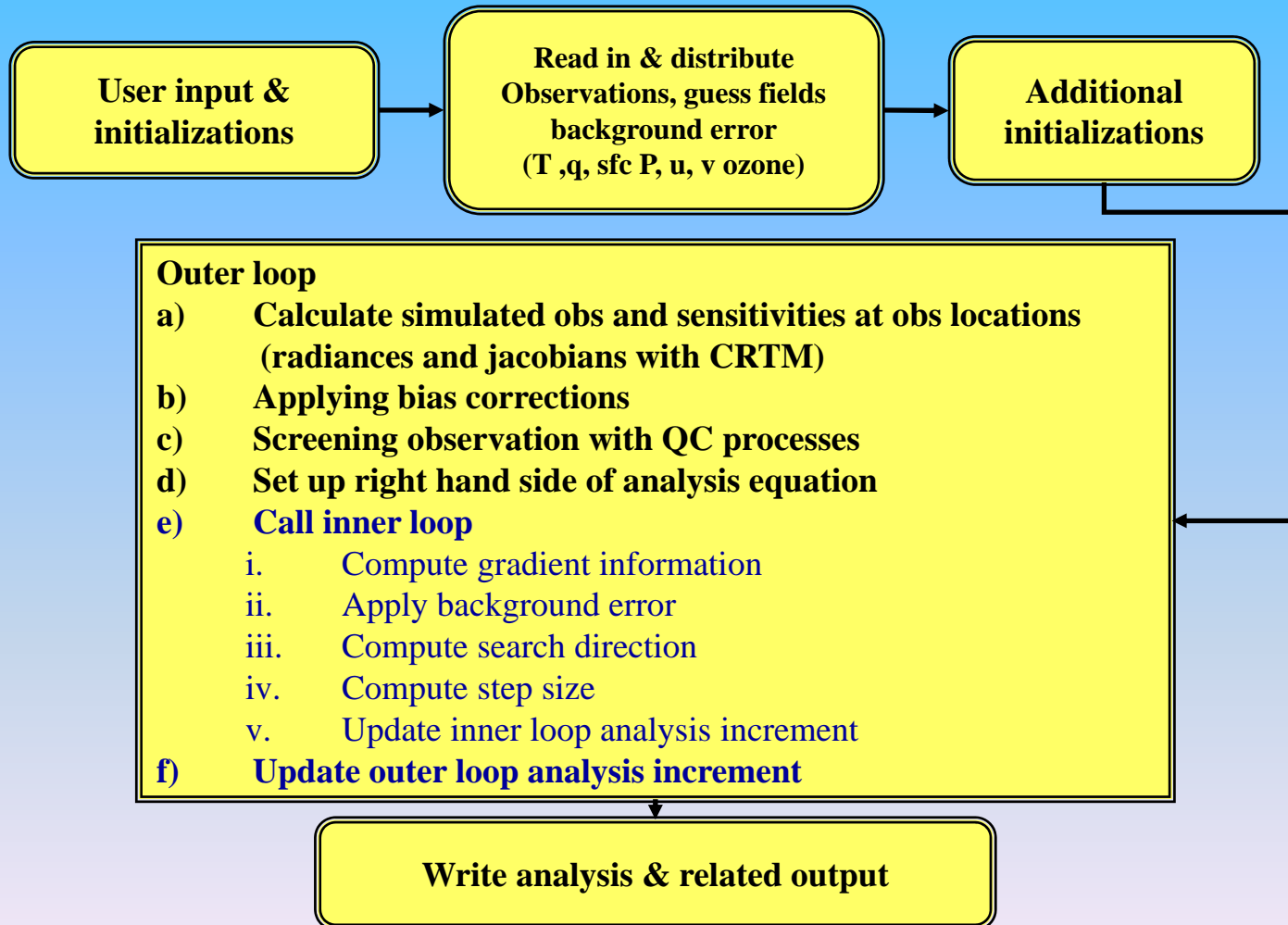
- Large numbers of radiances contain cloud (and precipitation) signal.
- If cloudy radiances can be properly used, potential for significant improvement in forecasts of temperature, wind, moisture and cloud fields.
- Initially addressing simpler problem with microwave and non-precipitating clouds
- Planned for initial operational implementation in the next next global GSI upgrade (Spring – Fall 2013)



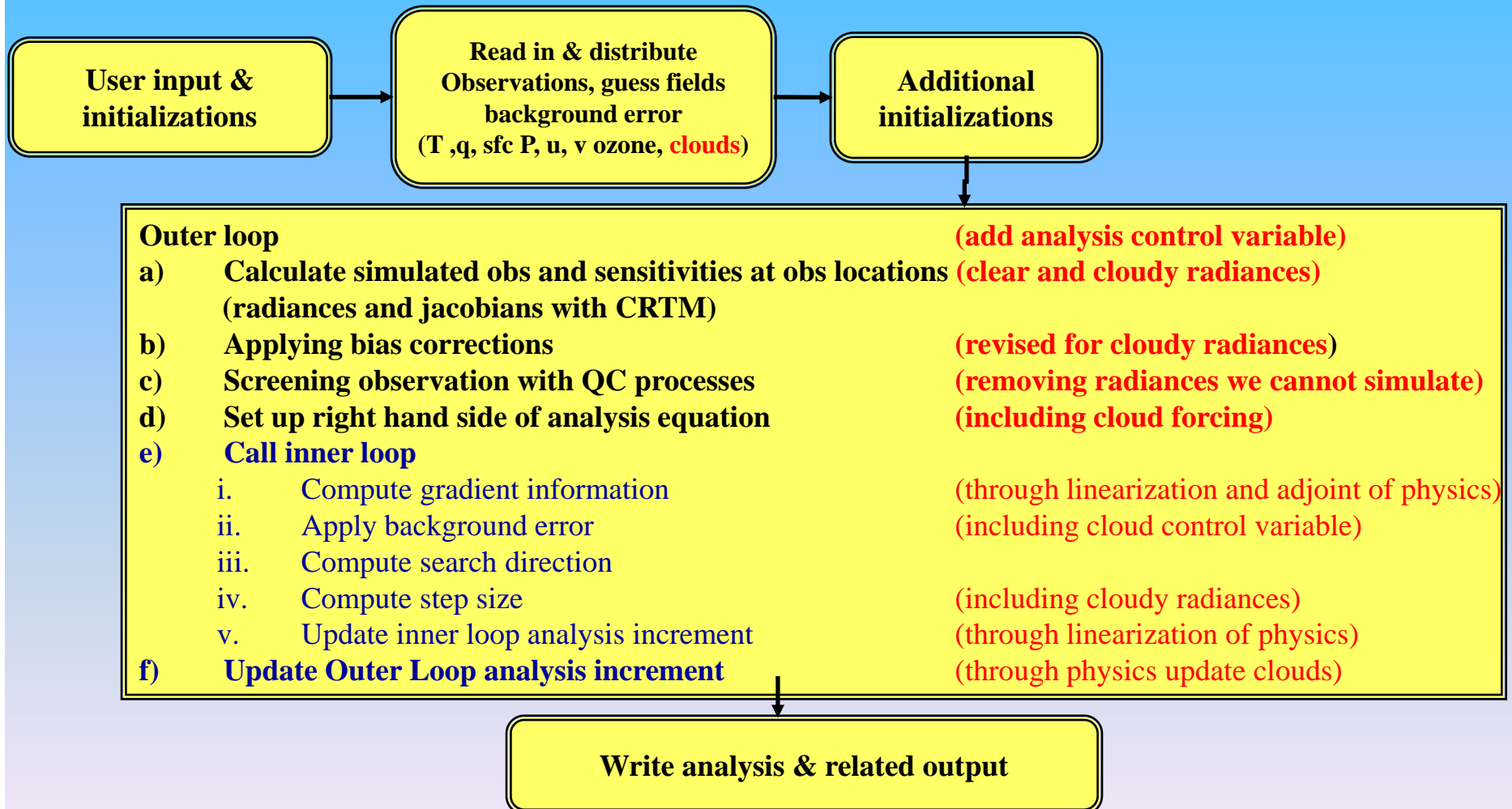
Necessary modifications for cloudy radiances

- Simulate cloudy radiances (CRTM)
- Define control variable(s) for clouds
- Define background error for control variable(s) – hybrid?
- Define quality control (currently only doing nonscattering clouds)
- Define observation errors
- Develop forward model for cloud physics
 - Tangent Linear
 - Adjoint (for gradient)

GSI w/o cloudy radiances



Revised procedure with cloudy radiances

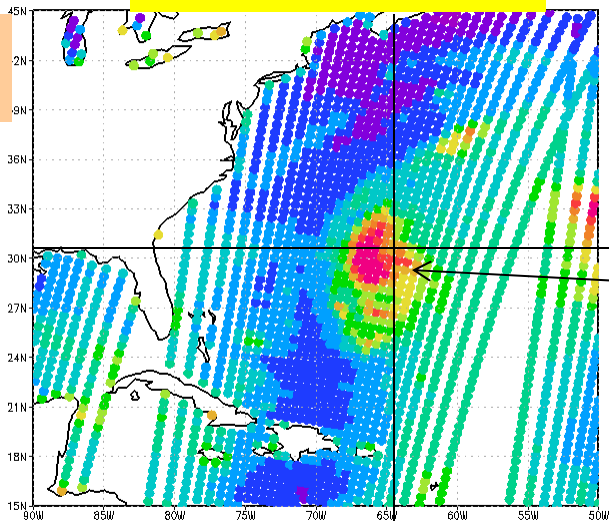


Observation operator

Community Radiative Transfer Model (CRTM)

AMSU-A Observed Tb

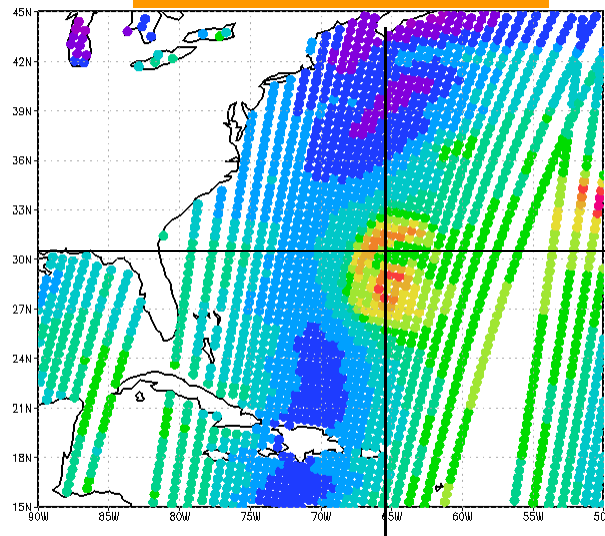
CH 2
31.4 GHz



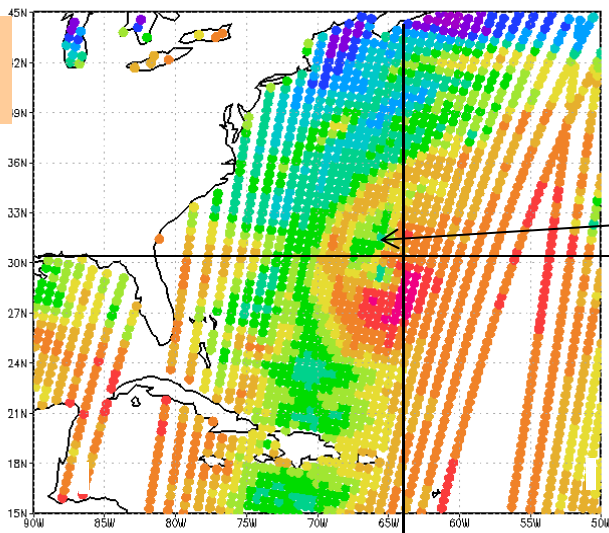
Much warmer than FG

First-Guess Tb

CH 2
31.4 GHz

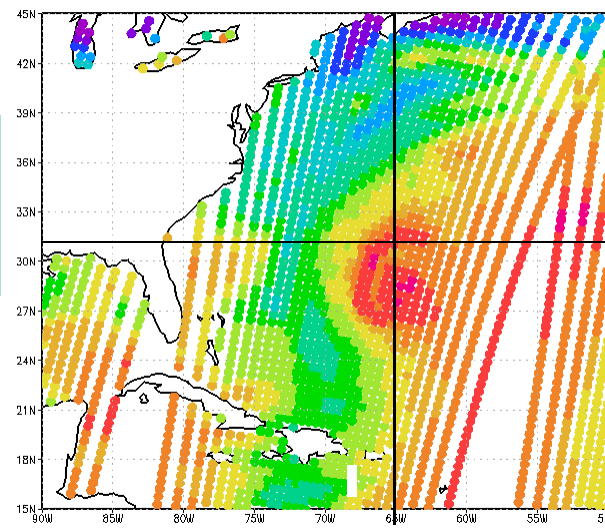


CH 15
89.0 GHz



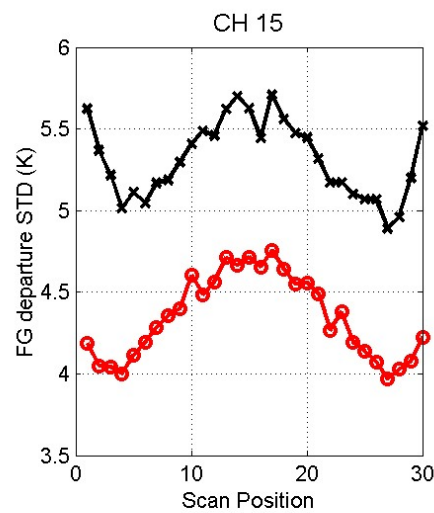
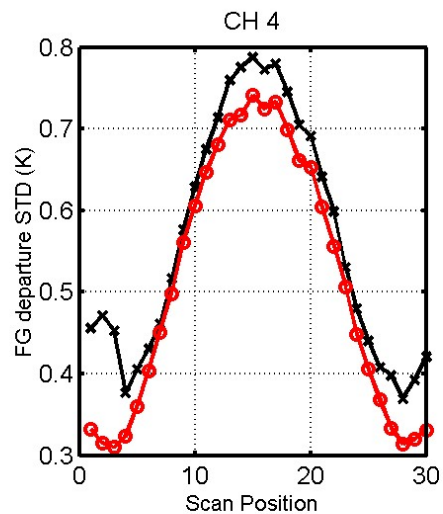
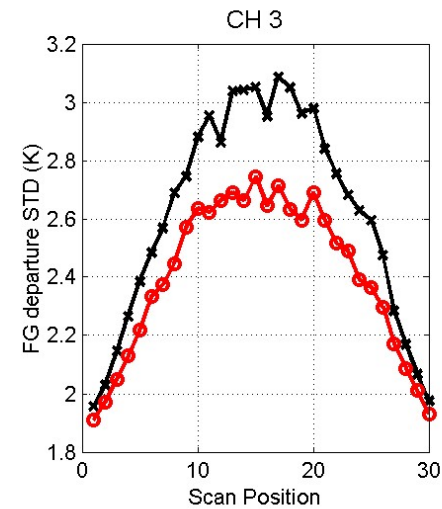
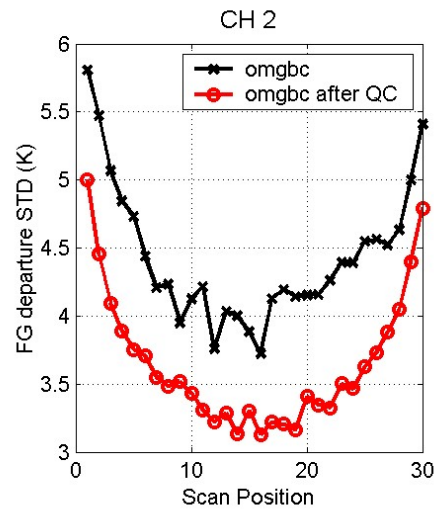
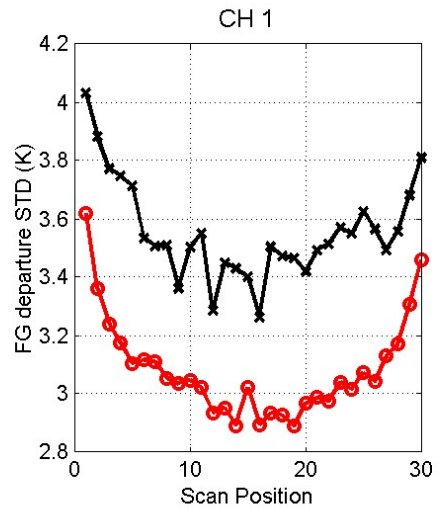
Scattering signal in observations.
-> Precipitation + ice clouds

CH 15
89.0 GHz



Observation Error (scan angle dependence)

Standard Deviation (STD) of First-guess Departure (NOAA-18 AMSU-A)

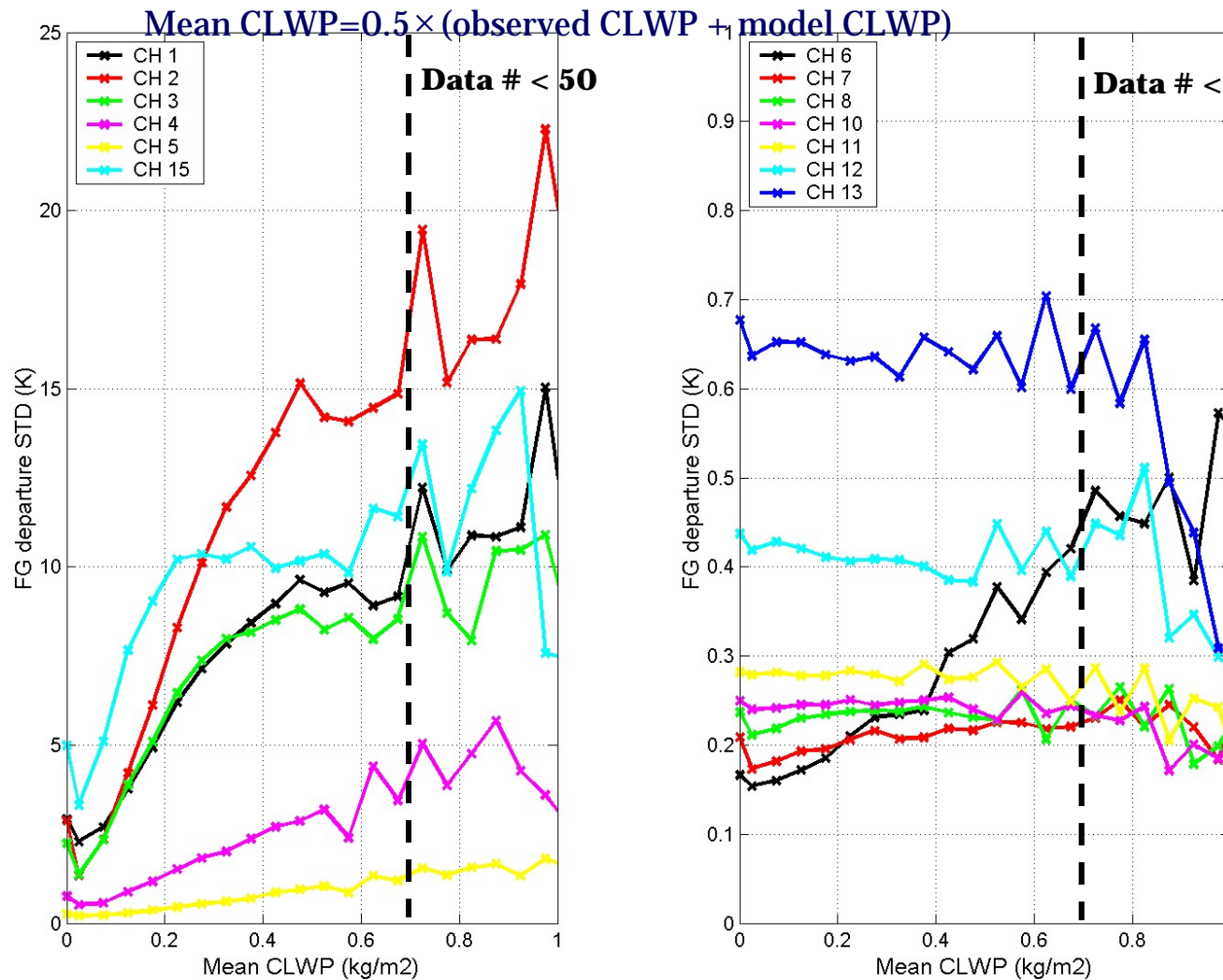


omgbc: O-F after bias correction
omgbc after QC: O-F after bias correction and QC passed

- Standard deviation depends on scan angle.
- Ch1,2,15 and Ch 3 and 4 behave differently.

Observation Error

Function of Mean Cloud Liquid Water Path (CLWP)



- FG departure divided by std ratio as a function of scan position were used to get STD in these plots.
- Once observation error are defined as function of CLWP, the error value will be rescaled by multiplying with std ratio depending on scan position.

Quality Control (QC)

1. Screening cloud affected AMSU-A data

Criteria: (1) scattering index (using ch1, 2, and 15 + ch6 Tb departure)

(2) retrieved clwp + ch4 Tb departure

→ **New: Screening retrieved averaged CLWP > 0.5kg/m² over the ocean**

2. Topography effect: for observations at Zsfc > 2km, observation errors get increased.

3. Transmittance at the top of the model less than 1 : inflating observation error

4. Too much sensitivity to sfc temperature/sfc emissivity: inflating observation error

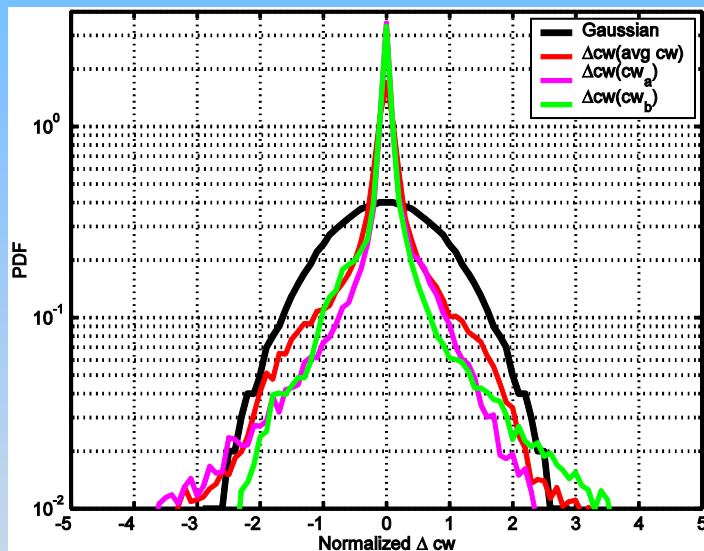
5. New gross check for all-sky (clear and cloudy) radiance data

$$\frac{|\Delta T b_{ich}|}{\sigma_{ich}} > 3 \quad \sigma_{ich} : \text{New observation error (i.e. function of averaged CLWP)}$$

Moisture Control Variable

What differentiates GSI analysis results when different configurations for moisture control variables are used?

Cloud water error statistics show “non-Gaussian” distribution.



Approach 1

- Single control variable: **total moisture, $q_{tot}(=q+q_c)$**
- **UK Met Office** has been using q_{tot} as a single moisture control variable

Approach 2

- Keep **two separate control variables** for water vapor and clouds
- However, **develop a different form of cloud water related control variable** of which error distribution is more Gaussian than q_c
- **ECMWF's** current efforts are toward this approach.
- This will be tested for comparisons with Approach 1.

Moisture Control Variable

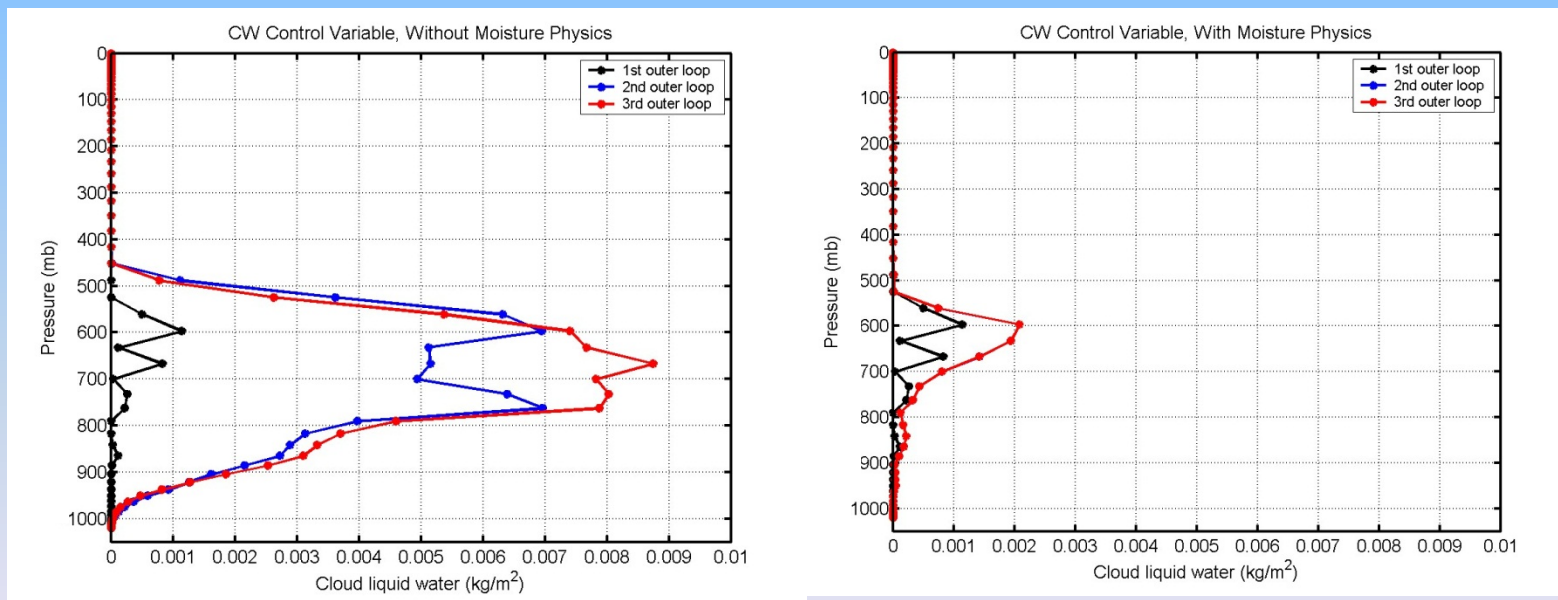
What differentiates GSI analysis results when different configurations for moisture control variables are used?

| | Moisture input for observation operator (CRTM) | Moisture Control variable |
|--|--|---|
| Operational (Control) | q | q |
| Approach 1 (Exp1) | q, ql, qi | q, cw(=ql+qi) |
| Approach 2 (Exp2) | q, ql, qi, rain, snow | q _{TOT} |
| Approach 3 (Exp3) (In progress by Emily Liu) | q, ql, qi | Normalized Total Relative Humidity (RH Total=ql+qi+cw) |
| Approach 4 (Exp4) (In progress by Min-Jeong) | q, ql, qi | Different forms of cw (e.g. cw/qs, cw/N where N is cloud coverage and qs is saturated mixing ratio) |



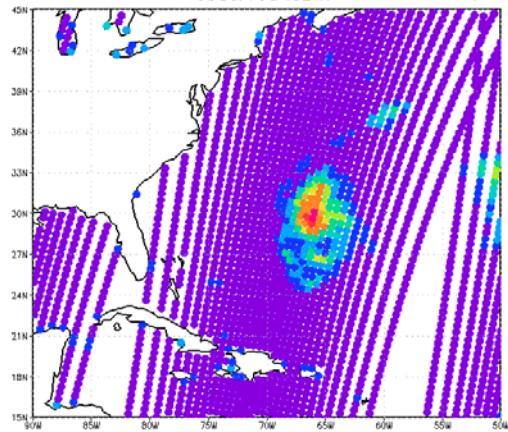
Single Obs Test Results

Cloud liquid water profiles

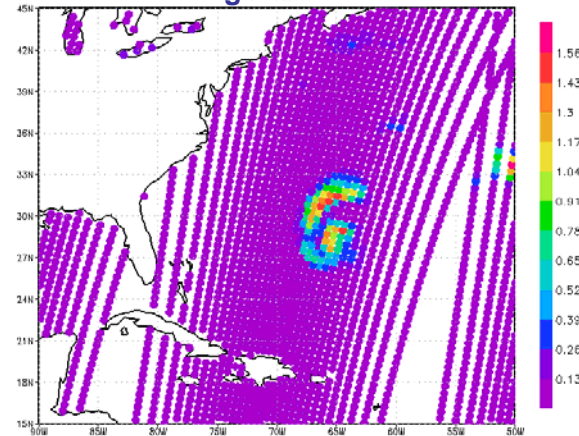


Cloud analysis increment

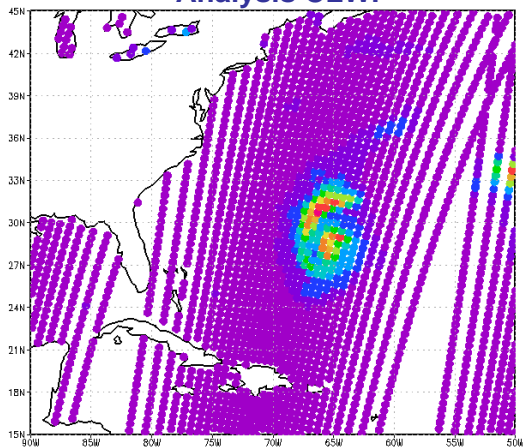
Retrieved CLWP (observations)



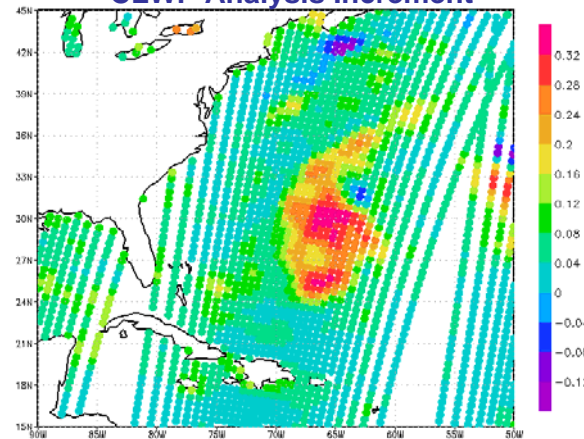
First-guess CLWP



Analysis CLWP



CLWP Analysis Increment



- Clouds have been actively assimilated.
- Cloud analysis fields got improved and closer to the observations (retrieved clouds).



Summary Cloud Assimilation

- There has been great progress in assimilating AMSU-A cloudy radiance data in NCEP Global Data Assimilation System (GDAS).
- New observation errors and quality control methods, which are applicable for clear and cloudy sky conditions, have been developed.
- Testing/comparing different options for moisture control variables are in progress.
- Preliminary results from case studies show that cloud fields are now being actively assimilated and cloud analysis fields get much closer to the retrieved values.
- Need to use hybrid background error for “cloud balance”. Dual Res???
- Will be used in simplest situations (microwave – non-precipitating) first in operations. (Planned for next Global GSI upgrade)



Use of observations

New data and improved use of current observations

- **Radar Data**
 - Creation and use of new VAD (after QC) winds – Shun Liu
 - Ground based Doppler radar data – Shun Liu
 - Aircraft based Doppler radar data – Mingjing Tong
- **Conventional Data**
 - Mesoscale surface observations – Manuel Pondeva, Steve Levine, XiuJuan Su
 - Use of visibility and wind speed in RTMA – Yanqiu Zhu
 - Improve use of significant levels in RAOB profiles – Wan-shu Wu
- **Satellite Data**
 - Use of ATMS and CrIS data - Andrew Collard (ATMS impact experiments run by JCSDA)
 - Use of consistent physical retrievals for CLW QC – Andrew Collard
 - Use of AURA MLS ozone profiles – Haixia Liu
 - Bias correction enhancements for GSI – Yanqui Zhu, David Parrish
 - Satellite wind usage upgrade (EUMETSAT and hourly winds) –XiuJuan Su
 - SSMI/S data – Andrew Collard, Emily Liu, Banghua Yan (NESDIS) and Ellen Liang (NESDIS)
 - GOES-R/SEVERI radiances – Haixia Liu
 - **Enhanced assimilation of GPS-RO data – Lidia Cucurull, R.J. Purser**



Enhanced assimilation of GPS-RO data

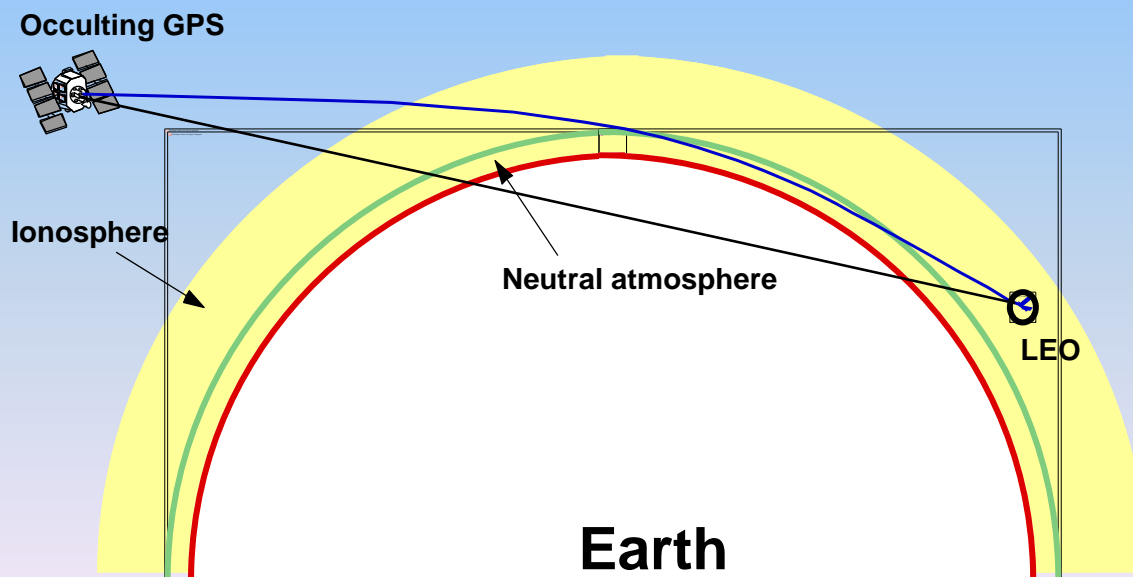
Lidia Cucurull, R.J. Purser

- To be implemented along with Hybrid is the use of Bending angle rather than Refractivity
- New and improved forward model to reduce eliminate singularities
- Data used up to 50km from 30km for refractivities
- Improved quality control (little data rejected)
- Cucurull, L., J.C. Derber, and R.J. Purser, A bending angle forward operator for GPS Radio Occultation measurements, submitted to JGR.



Radio Occultation concept

- An occultation occurs when a GPS (GNSS) satellite rises or sets across the limb wrt to a LEO satellite.
- A ray passing through the atmosphere is refracted due to the vertical gradient of refractivity (density).
- During an occultation (~ 3min) the ray path slices through the atmosphere

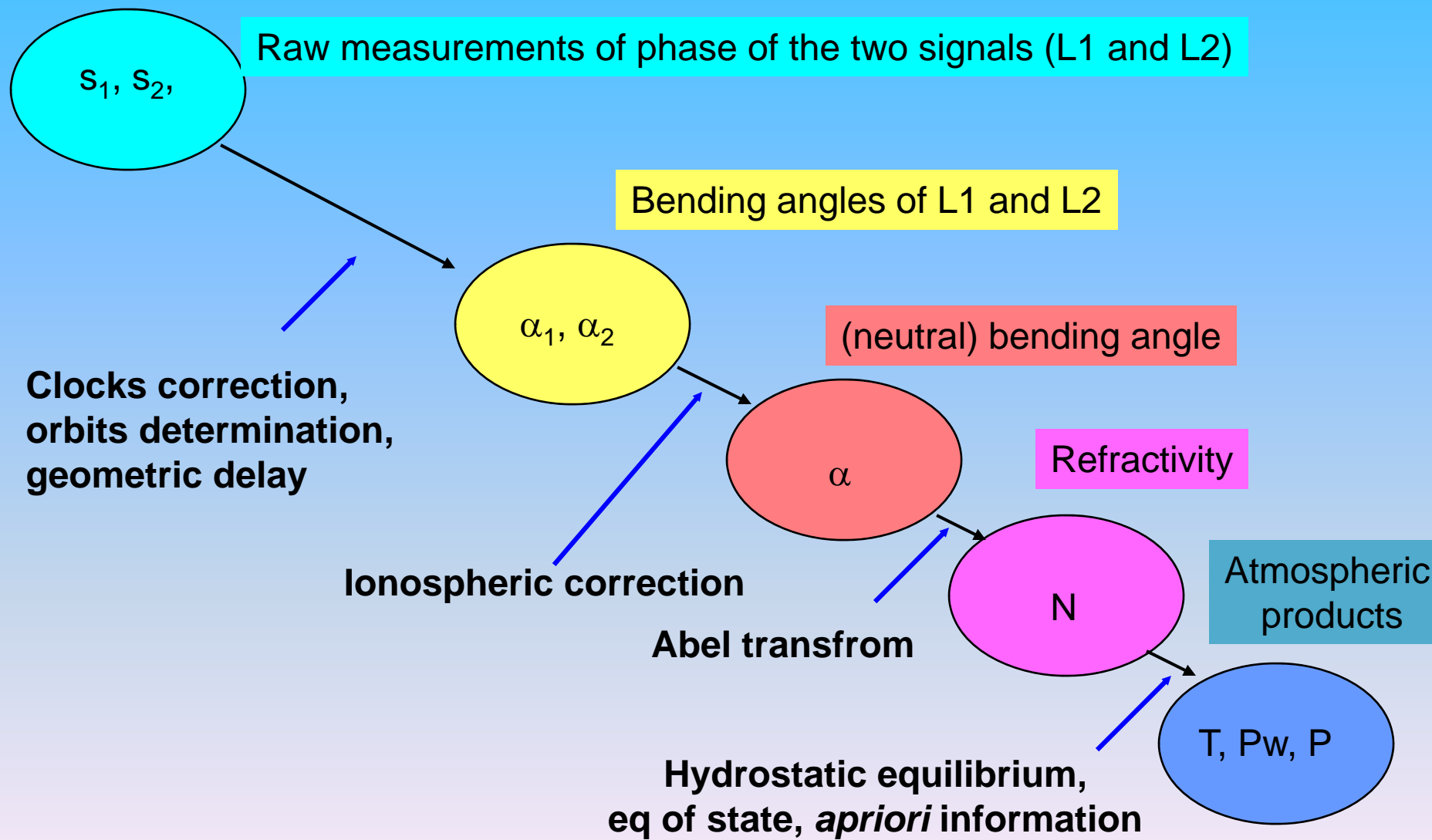


Raw measurement: change of the delay (phase) of the signal path between the GPS and LEO during the occultation. (It includes the effect of the atmosphere).

GPS transmits at two different frequencies: ~1.6 GHz (L1) and ~1.3 GHz (L2).



What do we “want” to assimilate?



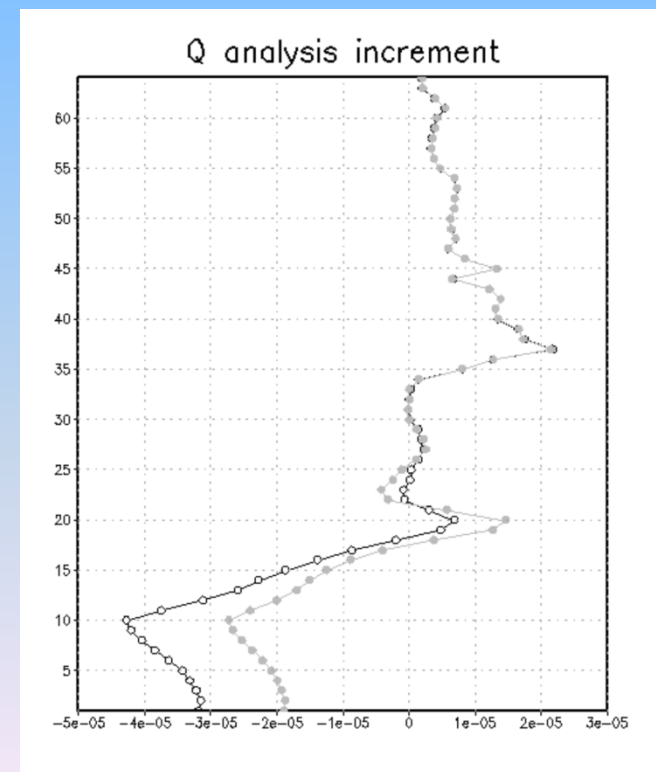
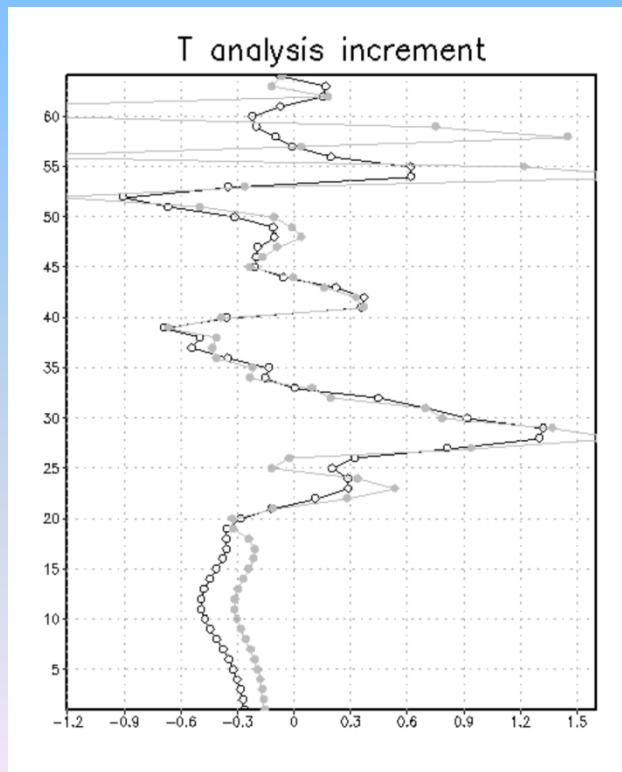


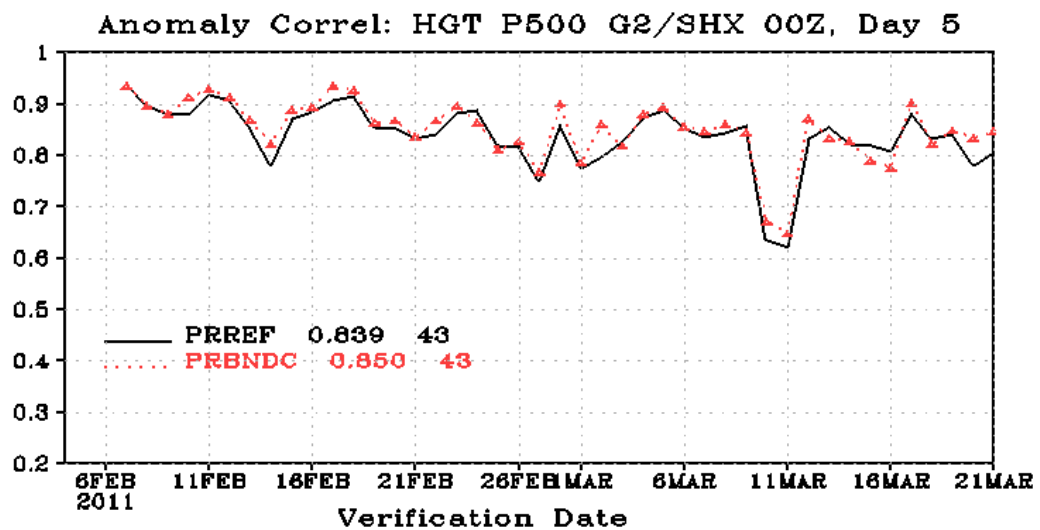
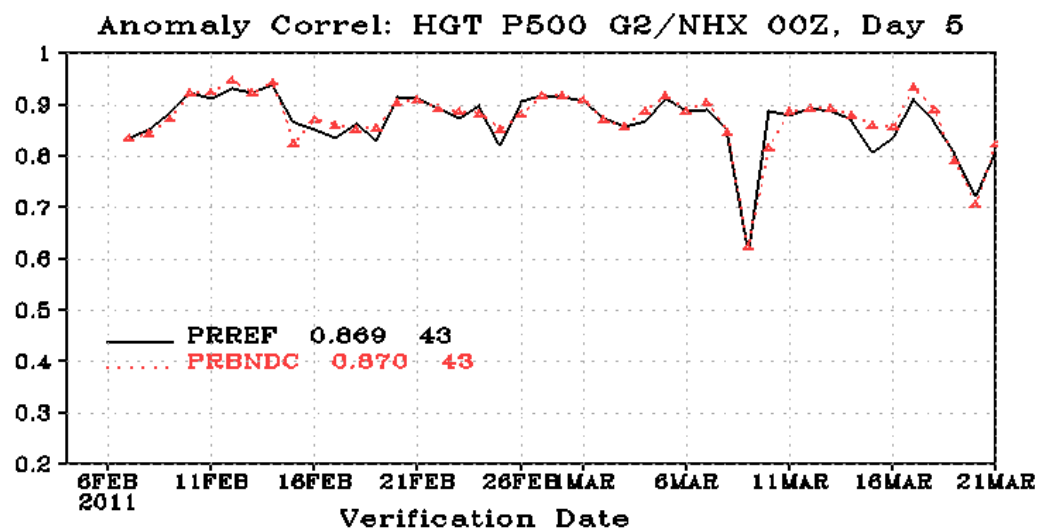
GPS RO Refractivity vs. Bending angle experiment design

- Uses COSMIC 1-6, SAC-C, TerraSAR-X, METOP/GRAS, GRACE-A, C/NOFS
- Period 1 February to 22 March 2011
- Non-Hybrid GSI
- T382L64



Impact of using bending angle rather than refractivity







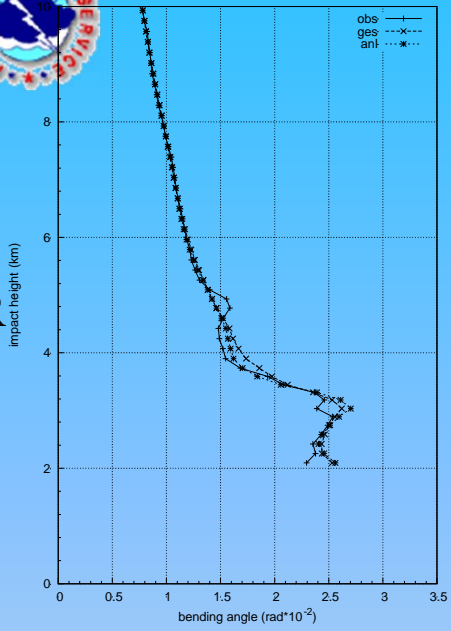
Current work

- Use of GPS RO data in Super-refraction layers
- Usually found in tropics at the top of the boundary layer. Large change in refractive index.
- Use of Refractivity data in this case results in negative bias and impacts all data below
- Cannot currently measure Bending Angles $> .03 - .04$ rad because of instrument SNR – but may be able to use data below the Super-refraction layer

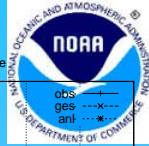
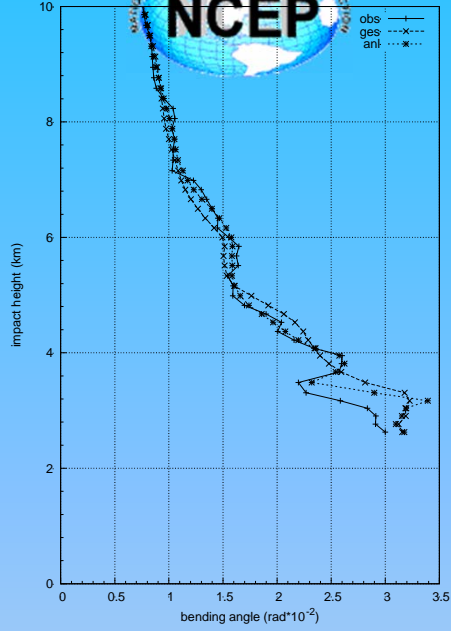
Non-SR



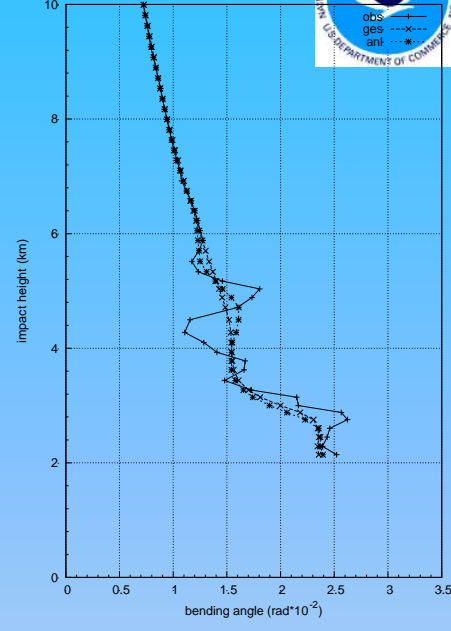
Northern Hemisphere



Tropics

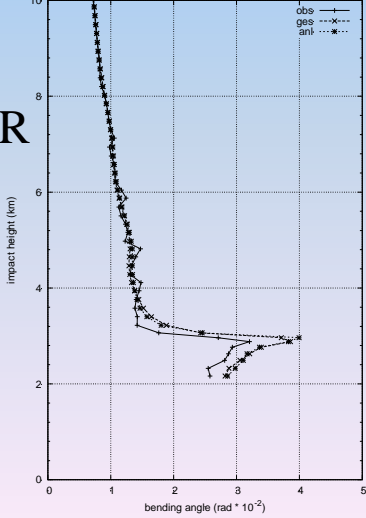


Southern Hemisphere

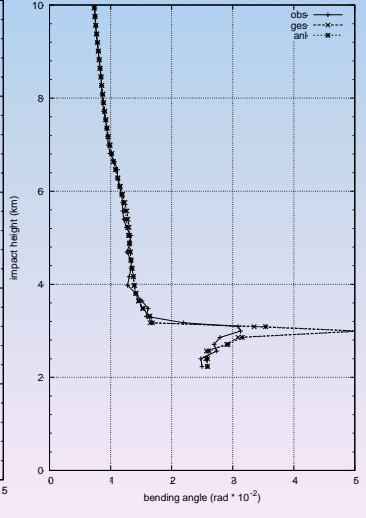


SR

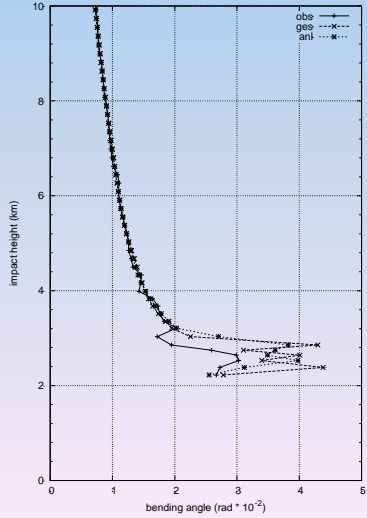
SR1



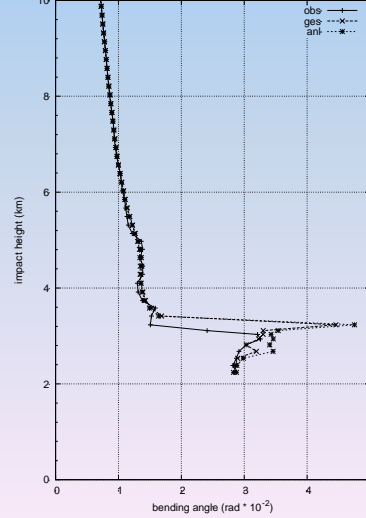
SR2



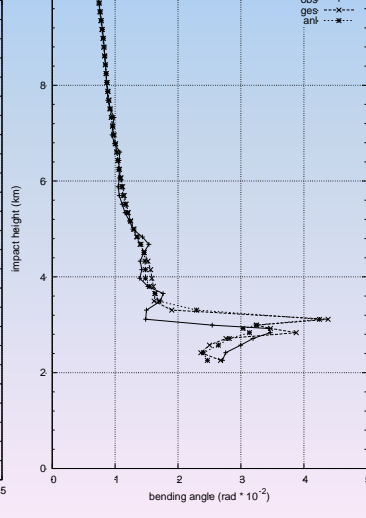
SR3



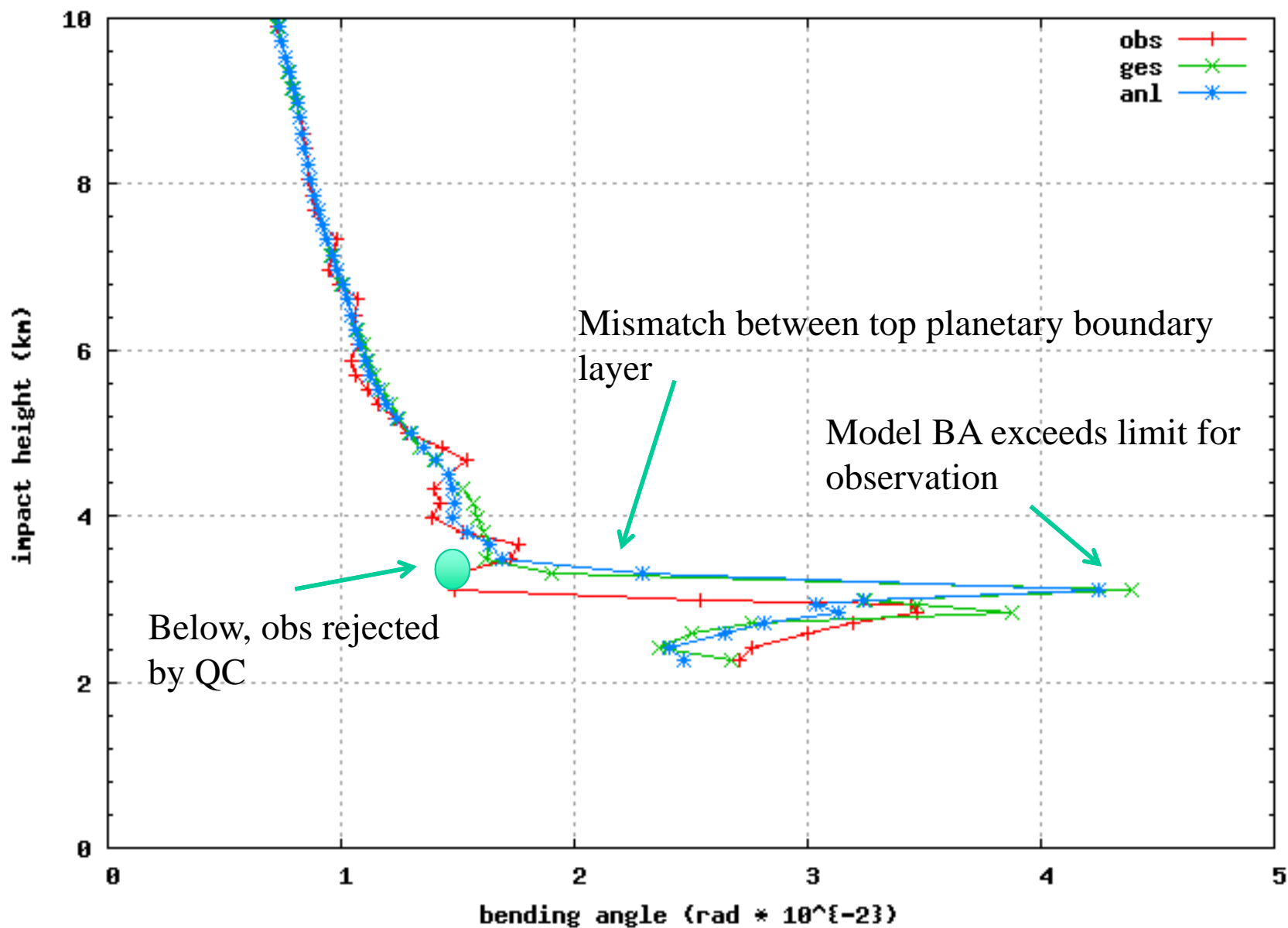
SR4



SR5



SR5





Maintenance, Collaboration and General improvements

- Improvement of RTMA application – Manuel Pondeca
- Improvement of NAM analysis – Wan-shu Wu
- Improvement of HWRF analysis – Mingjing Tong
- Add global NMMB capability – David Parrish
- Update to revised versions of global cloud and precip physics – Min-Jeong Kim
- Radiance maintenance and enhancement
 - CRTM improvement– Paul VanDelst, David Groff, Quanhua Liu(NESDIS), Yong Chen(NESDIS)
 - Add climatological CO₂, CO, NO₂, CH₄ - Runhua Yang
 - Radiance monitoring upgrade – Ed Safford
 - FOV updates for new satellite instruments – George Gayno, ?? (NESDIS)
- General Maintenance and improvements
 - Maintenance of EMC GSI trunk - Mike Lueken
 - Code Structure improvement – Mike Lueken, Ricardo Todling (GMAO)
 - Improve Structure of diagnostic files and unify data monitoring – Andrew Collard, Ed Safford
 - Code transfer to different machines – Daryl Kleist, Russ Treadon, Others
 - Code optimization – All
 - Pre-operational testing and parallels (Russ Treadon, George Gayno and all)



Major Future Activities

- Cloud Assimilation
- Hybrid enhanced (4d+) and extended to other models
- New observations – NPP, JPSS, GOES-R, METOP-B, etc.
- Aerosol and trace gas assimilation
- Improved use of currently used data
- Transition between machines/supporting operations
- Improved optimization/code structure
- Collaborative research