



Improving Near-Surface Temperature Forecasts in the NCEP Global Forecast System

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May 11, 2017

Motivations:

- **What is the problem about GFS surface temperature forecast?**

- *One of Top 10 problems in the GFS*

- NWS Field Office, NCEP/EMC Model Evaluation Group (MEG)

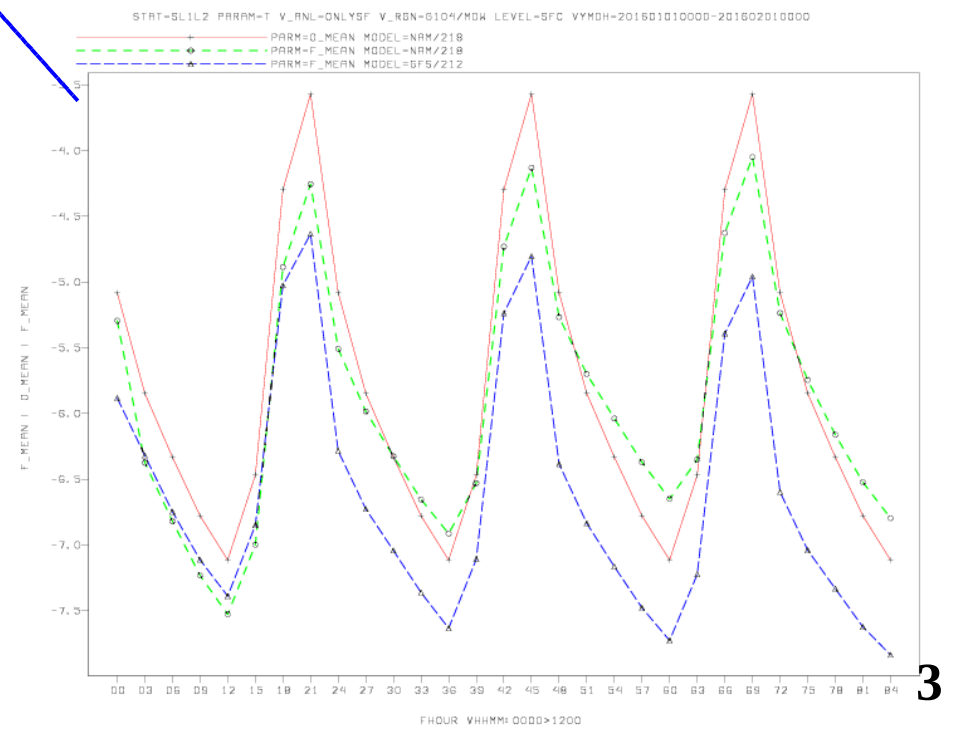
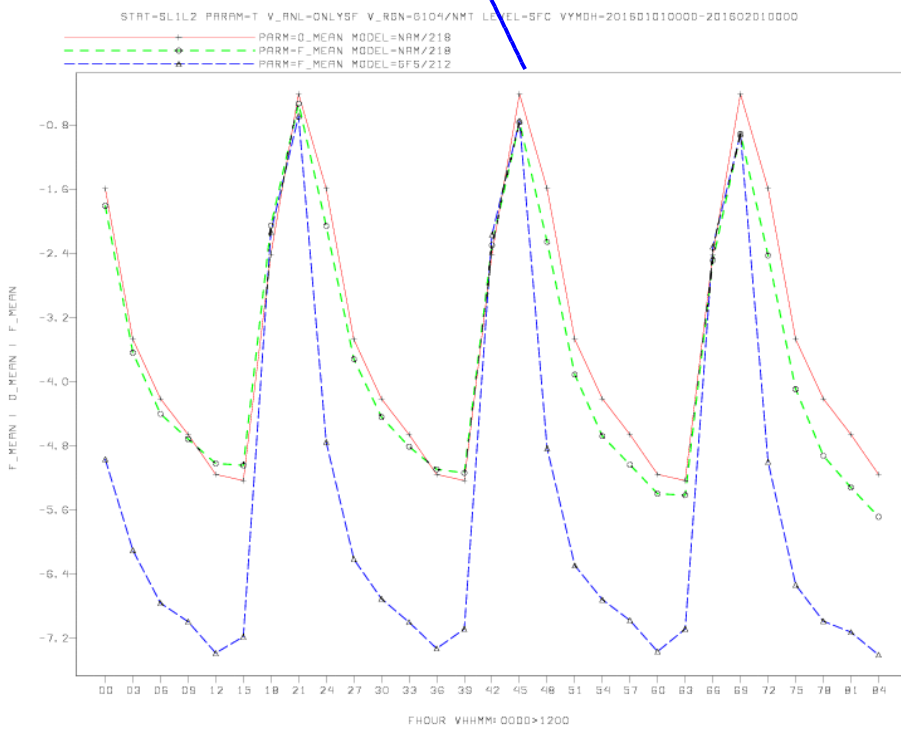
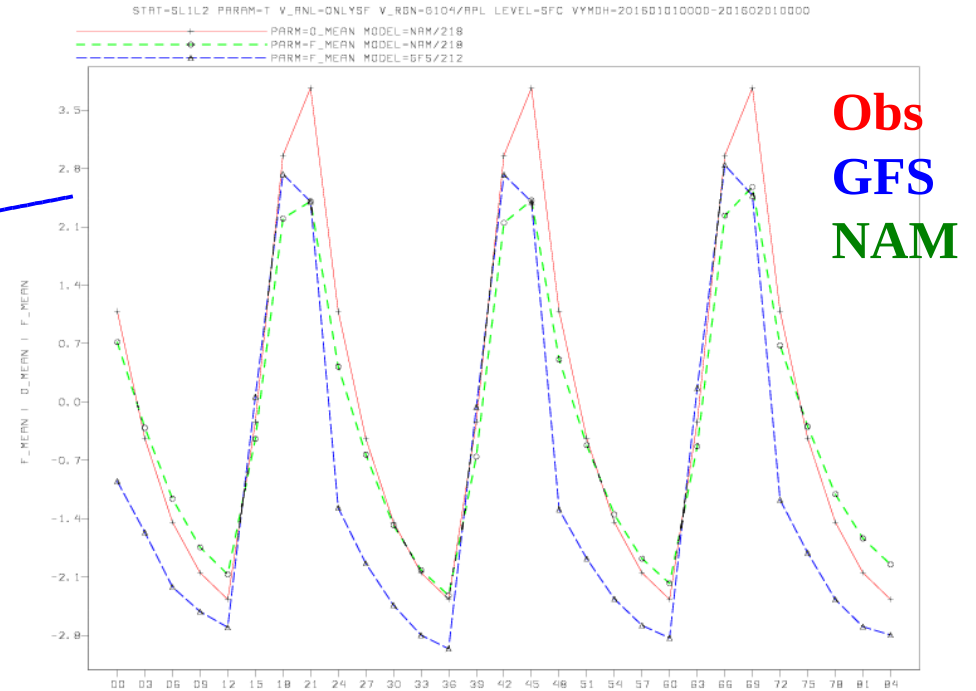
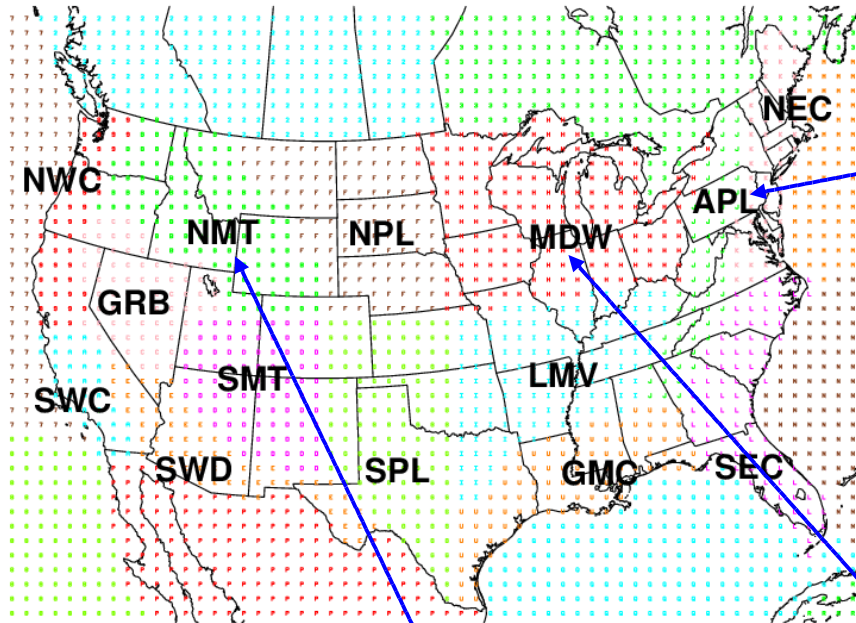
- **What causes this kind of problem?**

- *Understanding of stable boundary layer (SBL) processes*

- **How to solve the problem?**

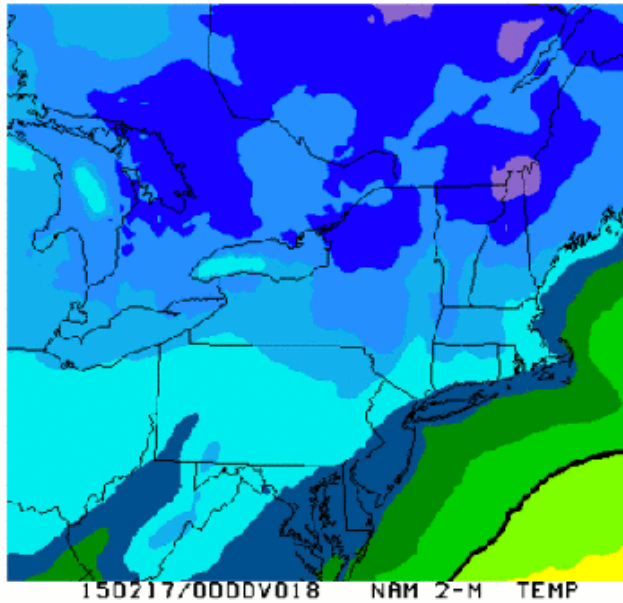
- *An approach to fix the problem*

Ops GFS: T2m Forecast Verification Statistics for Jan 2016

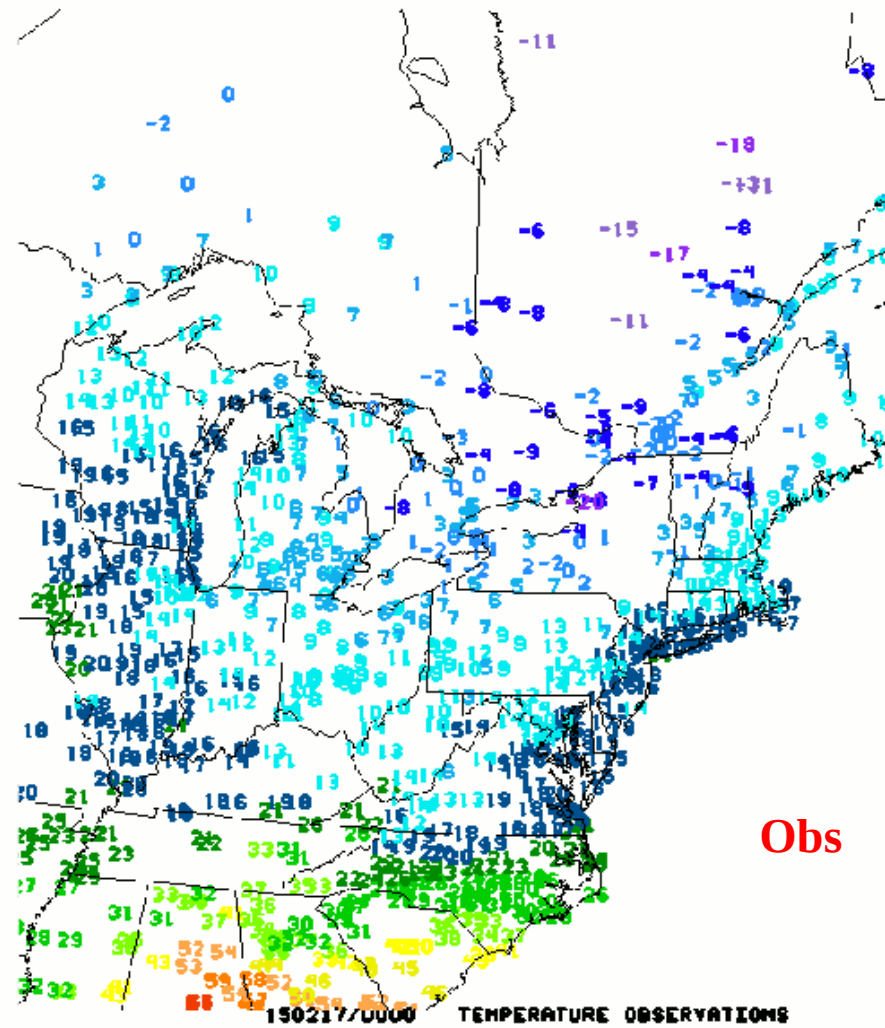
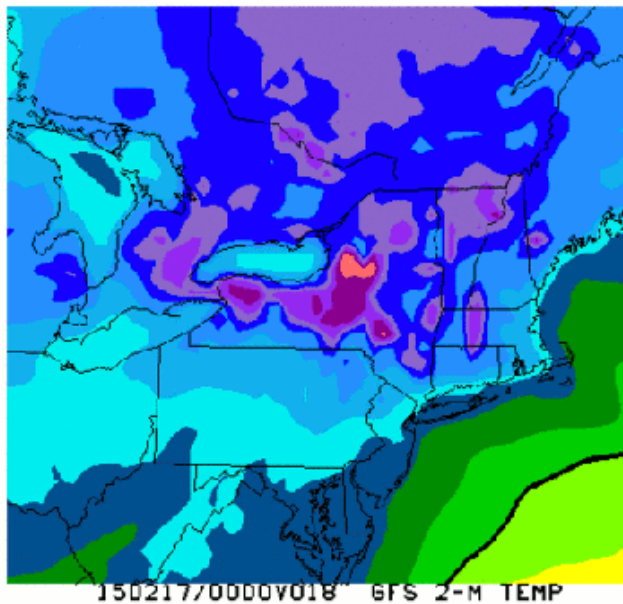


Comparison of T_{2m} (F): NAM, GFS and Obs, 00UTC, 2015-02-17

NAM



GFS

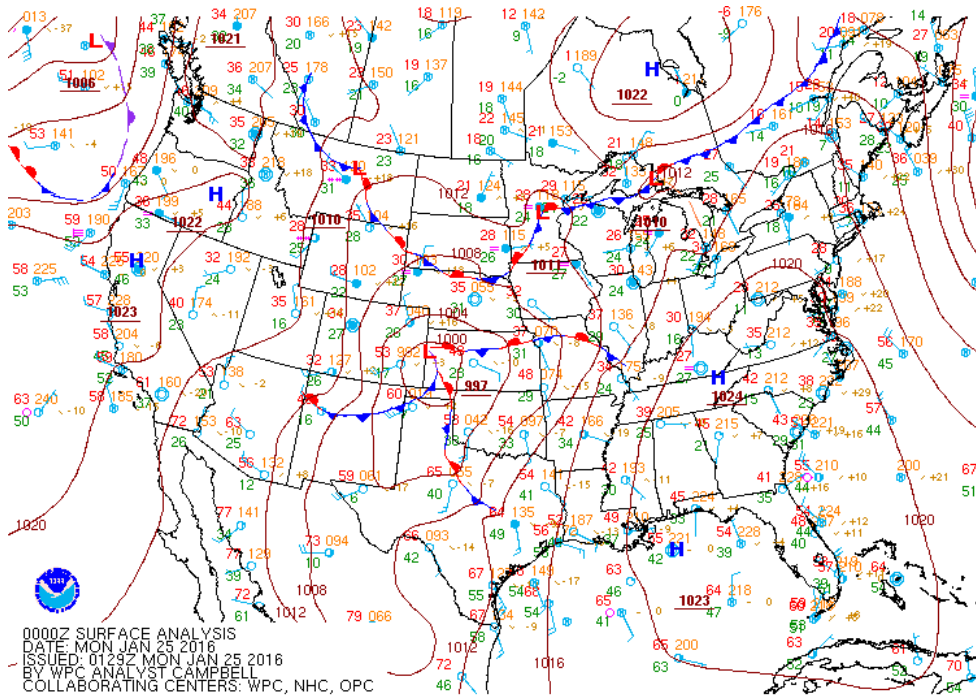


Obs

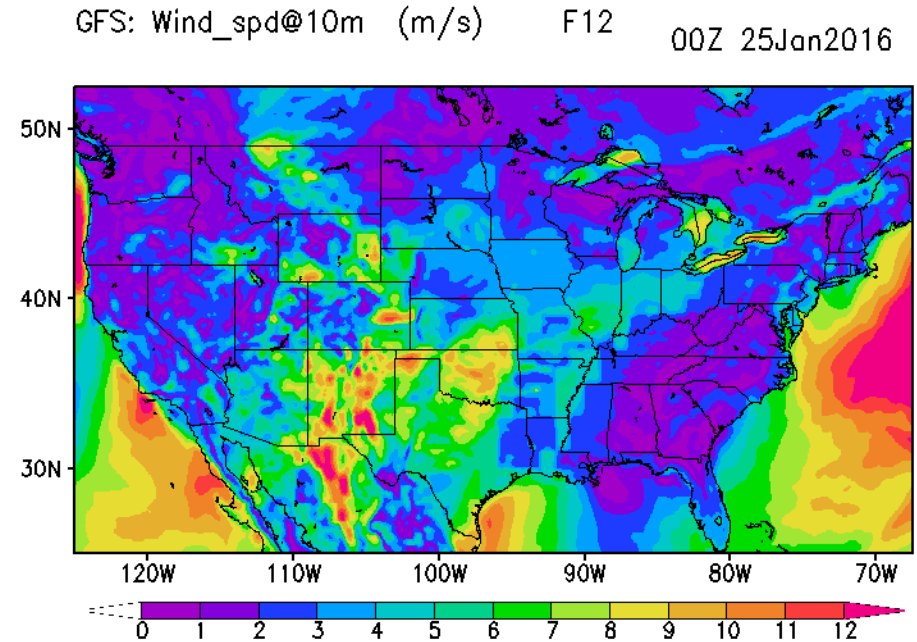
Courtesy Geoffrey Manikin, MEG- 02/19/15 4

Case 1: Large Cold bias of GFS T2m: Case of 25 Jan 2016

Surface weather map: 00Z 25Jan 2016



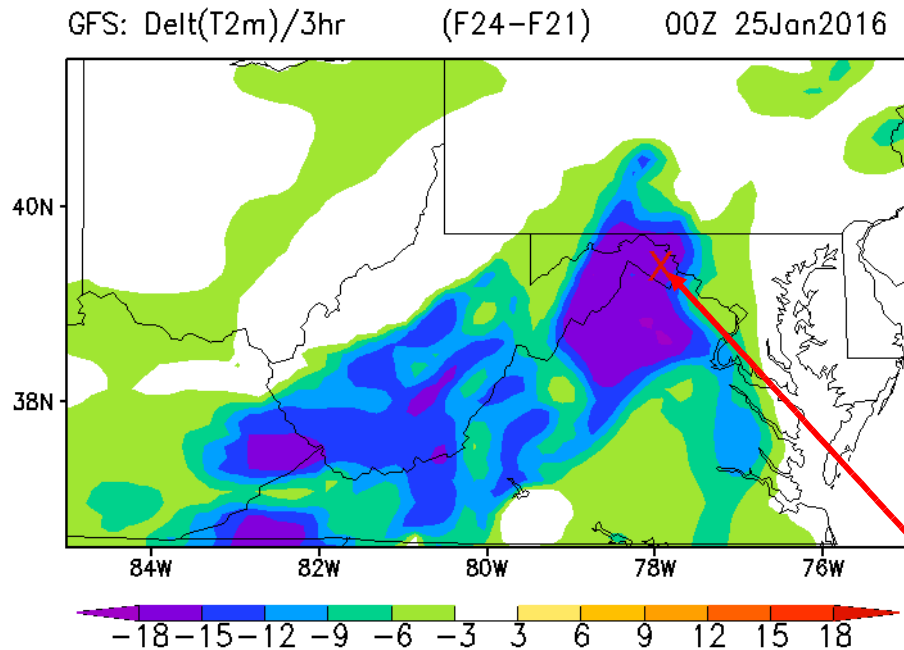
GFS Wind speed at 10m: 00Z 25Jan 2016



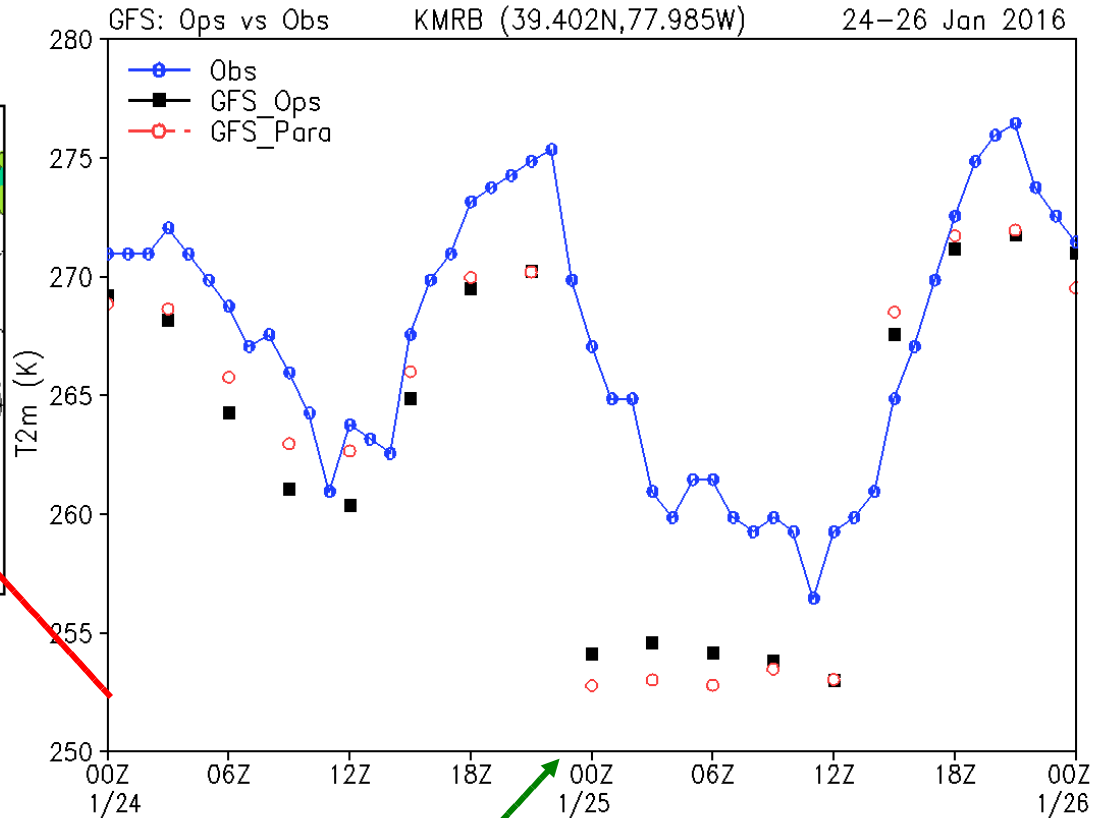
Southeast: High pressure system; Low wind speed less than 2 m/s

GFS/GFSX T2m @ MRB Matinsburg RGNL, WV

00Z 01/24/2016 Cycle



T2m @ KMRB

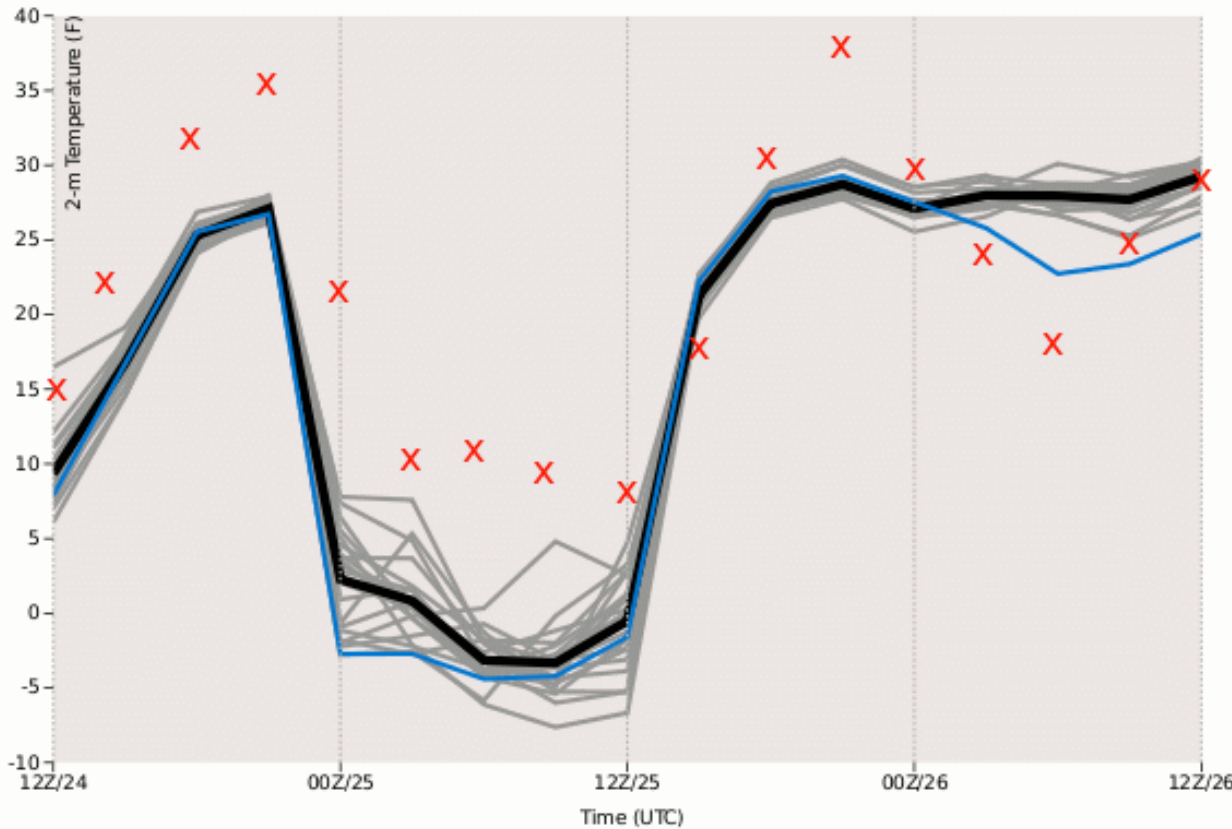


**Ops GFS or GFSX: Rapidly cooling up to 15 °C during 3hr;
About 13 degrees of cold bias at 00Z, 25 Jan.
GFSX: Became current operational version on May 11, 2016.**

GEFS T2m @ MRB, WV

12Z 24 JAN2016 Cycle

EMC's GEFS plumes for: KMRB
12 UTC 24 January 2016 cycle



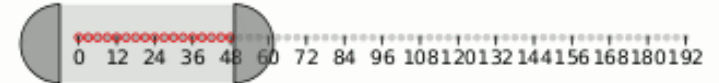
-10

40

Set y axis

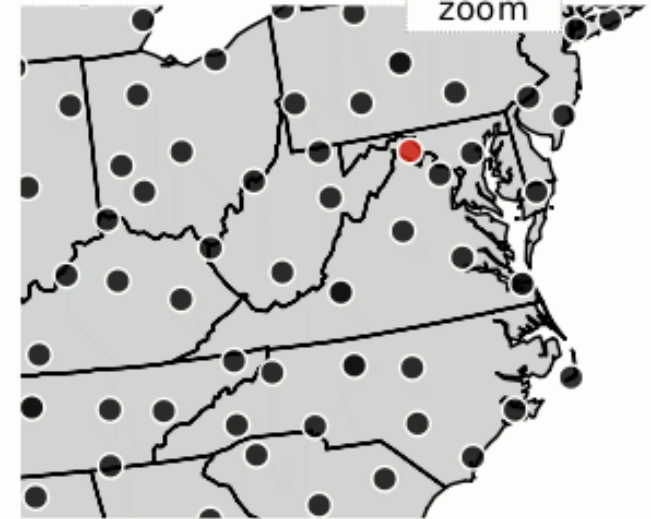
Reset y axis

Choose forecast hours to span by adjusting gray box



Click map to zoom/recent

Reset zoom



Variable: 2-m T

cycle: 2016012412

start total accumulated QPF at 0 inches when adjusting forecast hours spanned

About the plumes: Data for each station is interpolated from a 0.5-degree grid for both the GEFS (gray lines for control and perturbed members; black for mean) and GFS (blue line). The precipitation-type plot uses the closest gridpoint to each station as opposed to interpolation and does not contain a trace for the GFS. Click on the map to zoom for more stations.

This site is not operational; therefore, data may be missing occasionally.

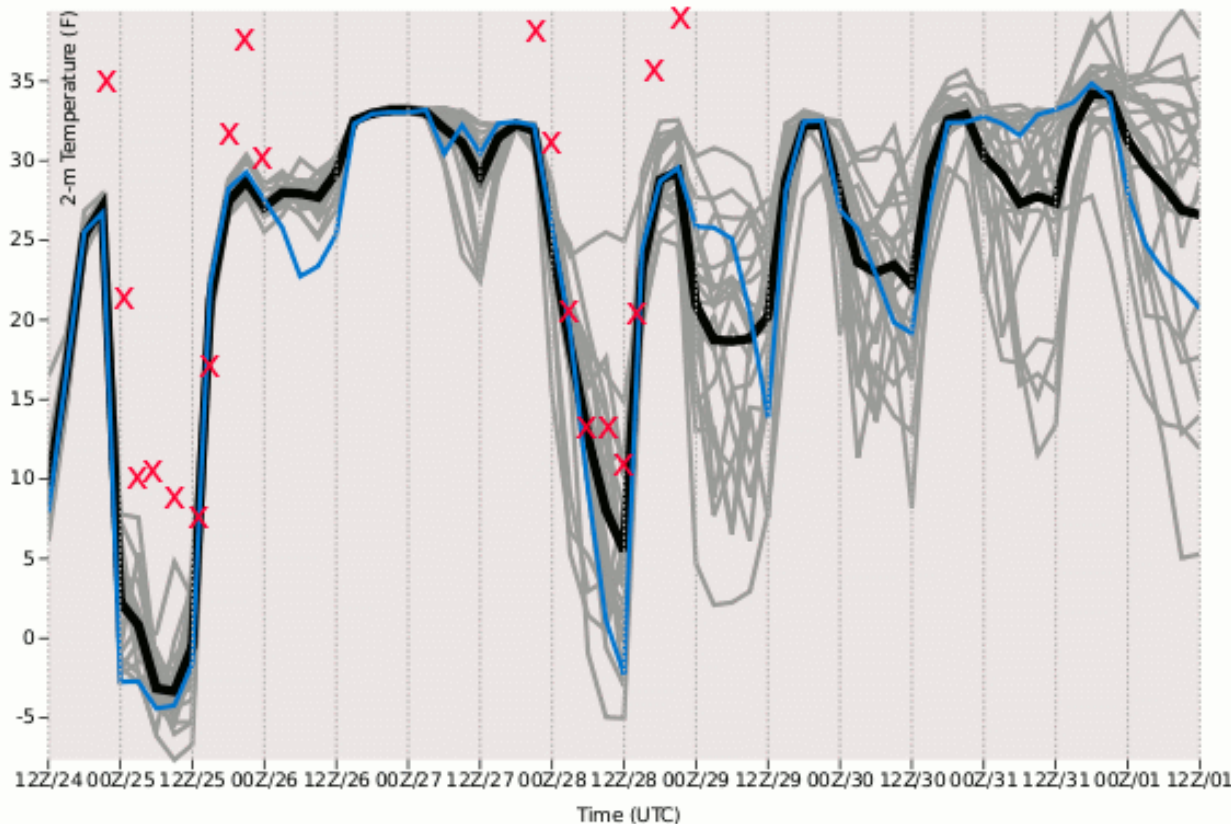
Courtesy Tracey Dorian

x: Observation Black: GEFS mean Blue: Ops GFS

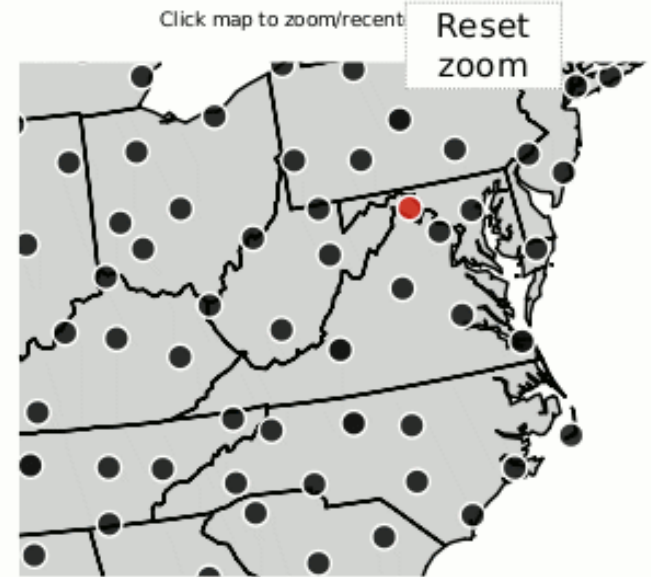
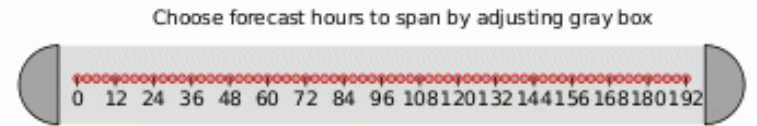
GEFS T2m @ MRB, WV

12Z 24 JAN2016 Cycle

EMC's GEFS plumes for: KMRB
12 UTC 24 January 2016 cycle



y min y max Set y axis Reset y axis



Variable: 2-m T Cycle: 2016012412

start total accumulated QPF at 0 inches when adjusting forecast hours spanned

About the plumes: Data for each station is interpolated from a 0.5-degree grid for both the GEFS (gray lines for control and perturbed members; black for mean) and GFS (blue line). The precipitation-type plot uses the closest gridpoint to each station as opposed to interpolation and does not contain a trace for the GFS. Click on the map to zoom for more stations.

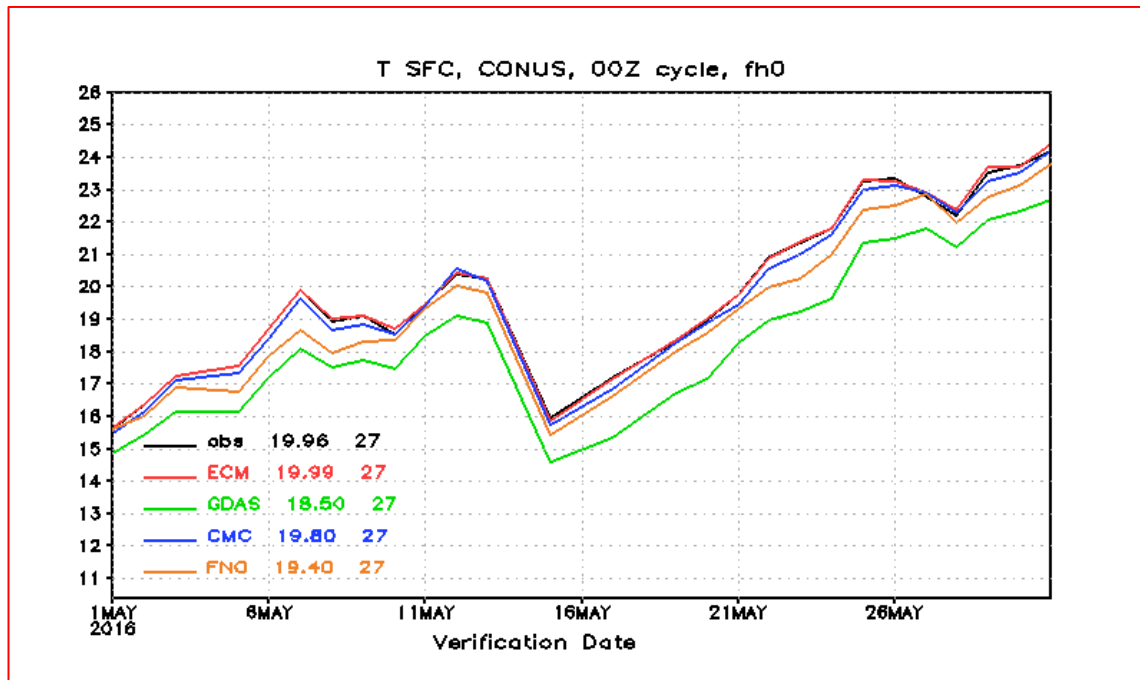
This site is not operational; therefore, data may be missing occasionally.

x: Observation **Black: GEFS mean** **Blue: Ops GFS**

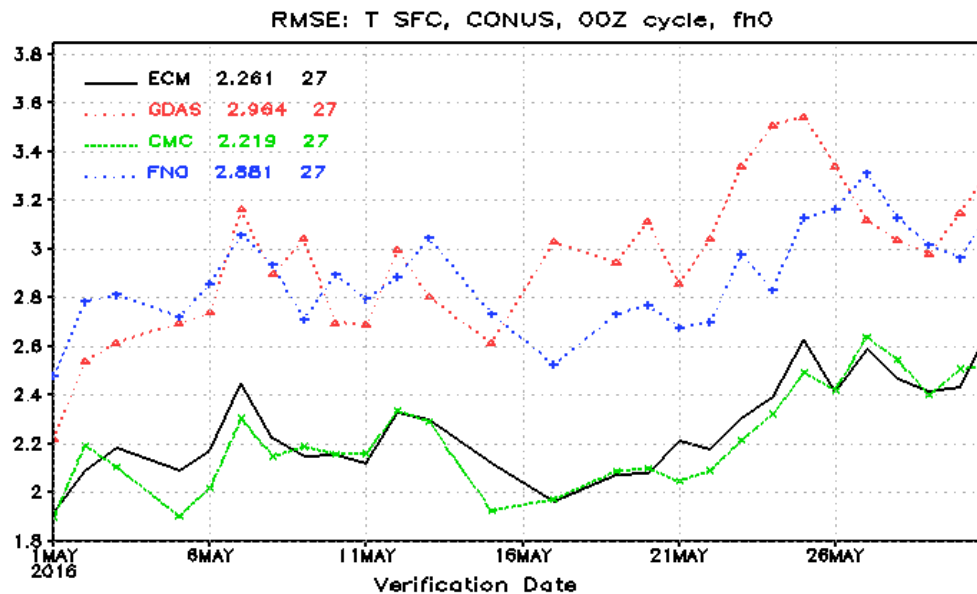
Courtesy Tracey Dorian

Verification of T2m for model analysis (00Z) 1-31 May 2016

BIAS



RMSE



● *GDAS T2m is colder than other models;*

● *GDAS T2m has larger RMSE than ECM and CMC.*

Courtesy Wen Meng

Structure of the Atmosphere Boundary Layer

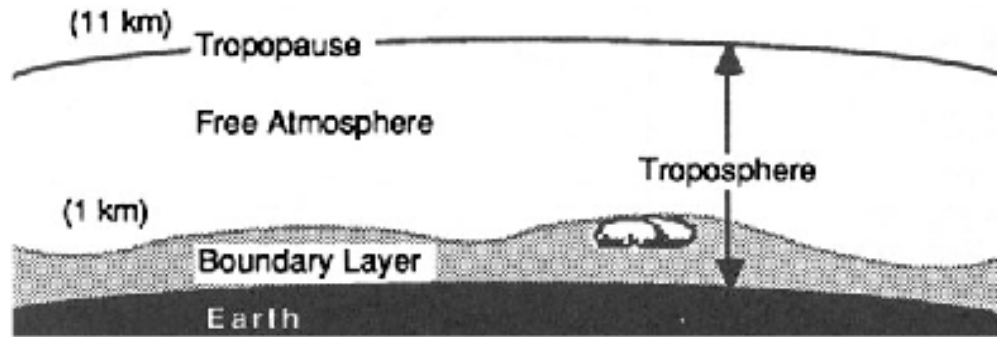


Fig. 2.1 The troposphere and its two parts: the atmospheric boundary layer and the free atmosphere (Stull 2000)

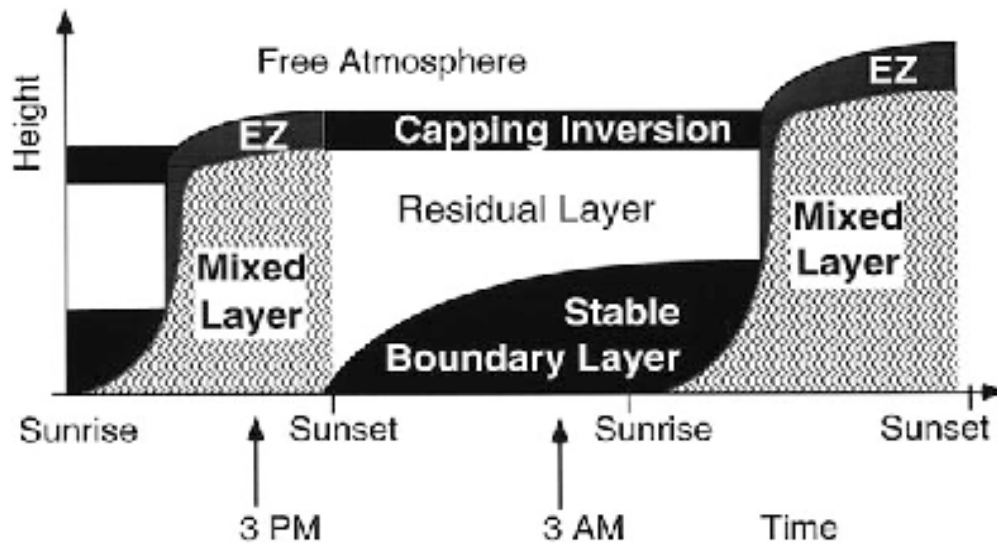
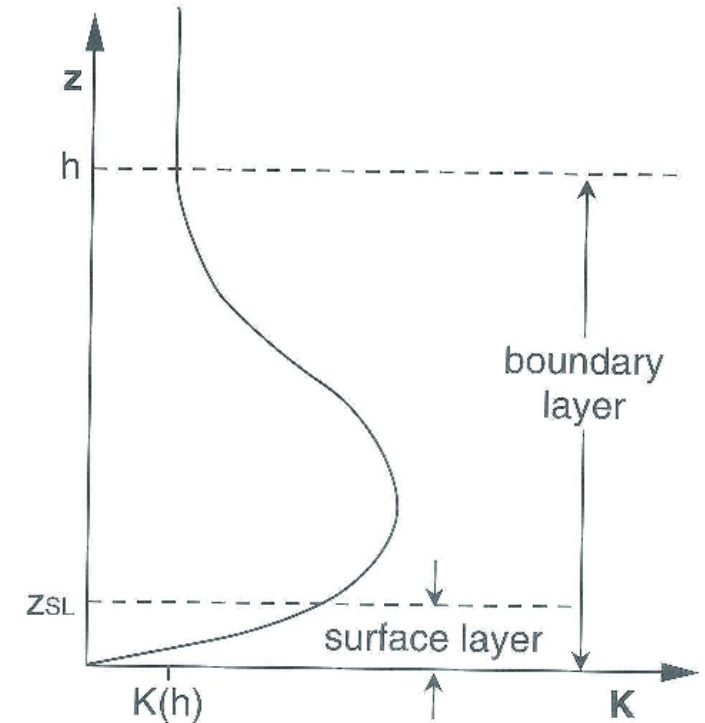


Fig. 2.2 Daily cycle of the structure of the atmospheric boundary layer (Stull 2000), EZ Entrainment zone



Hong & Pan, 1996

Land-Atmosphere Stable Boundary Layer

Surface Energy Balance:

$$(Dn_{SW} - Up_{SW}) + (Dn_{LW} - Up_{LW}) = SH + LH + G + \text{Other forcings}$$

$$SH = \rho c_p C_h U_a (T_{sfc} - T_{air})$$

$$LH = \rho L_v C_q U_a (q_{sfc} - q_{air})$$

$$G = (K_T / \Delta z) (T_{sfc} - T_{soil})$$

$$Up_{LW} = \epsilon \sigma_{SB} T_{sfc}^4$$

Other forcings: Sfc pressure, meso motions, gravity wave, etc.

Night-time surface energy budget (No SW; LHF is small so neglected):

(A) Under turbulence: $SH + G \sim Dn_{LW} + Up_{LW} \implies$ quasi-steady state

(B) Under cessation of turbulence: $G \sim Dn_{LW} + Up_{LW} + (others) \implies$ new state

The system may reach different equilibrium states !

Consider a clear night, where the surface cools strongly by radiative loss to space. Two possible SBL responses:

(A) Negative feedback: To generate downward heat flux ==> compensate radiative surface cooling -----> quasi-stead state

$$T_{sfc} \downarrow \rightarrow \Delta T \uparrow \rightarrow SH \uparrow \rightarrow T_{sfc} \uparrow$$

(B) Positive feedback: To reduce turbulent fluxes ==> perhaps ultimately to zero -----> different regime (very stable regime)

$$T_{sfc} \downarrow \rightarrow \Delta T \uparrow \rightarrow u_* (T_*) \downarrow \rightarrow SH \downarrow \rightarrow T_{sfc} \downarrow$$

Negative feedback: leading to a quasi-stead state

Positive feedback: leading to excessive cooling

Decoupling: defined as a cessation of turbulent transport between the surface and the atmosphere due to high near surface atmospheric stability. (intermittent) (discontinuously as a function of external parameters or loss of predictability)

Monin-Obukov Similarity Theory in GFS (SBL)

$$C_M = k^2 / F_M^2 \quad C_H = k^2 / F_M F_H$$

$$\varphi_M = \varphi_H = \frac{1}{2} (1 + \sqrt{1 + 4\alpha\xi}).$$

$$\xi = z/L \quad L = \frac{\theta}{kg} \frac{u_*^2}{\theta^*}$$

$$F_{M,H} = \int_{z_0}^z \frac{dz'}{z'} \varphi_{M,H}(z'/L)$$

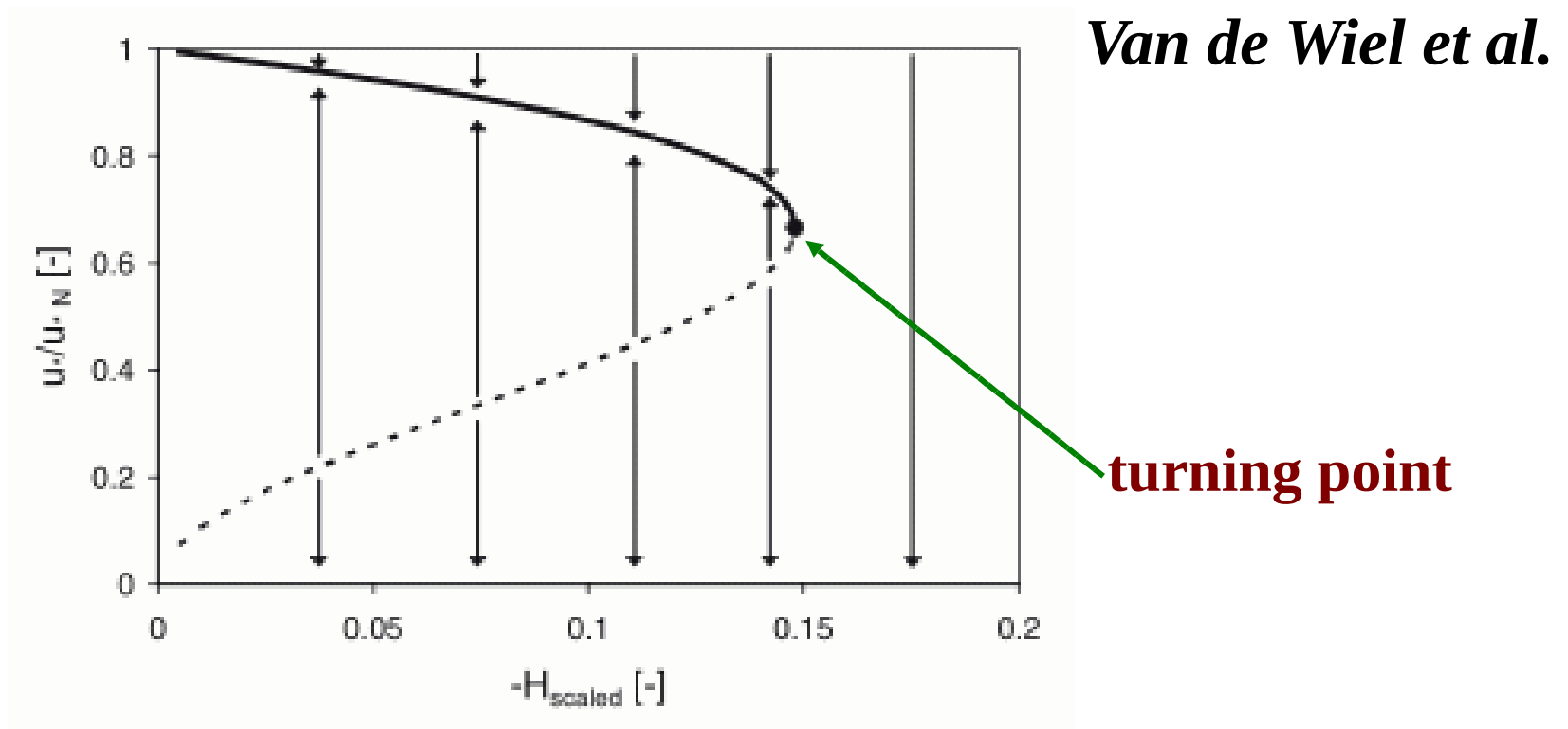
$$F_{M,H} = \ln \frac{z}{z_{0M,H}} - \psi_{M,H} \left(\frac{z}{L}; \frac{z_{0M,H}}{L} \right),$$

$$\psi_{M,H} = \sqrt{1 + 4\alpha\xi_{0M,H}} - \sqrt{1 + 4\alpha\xi} + \ln \frac{\sqrt{1 + 4\alpha\xi} + 1}{\sqrt{1 + 4\alpha\xi_{0M,H}} + 1}$$

$$\xi_{0M,H} = z_{0M,H}/L.$$

The flux-profile has no limitation of a finite critical bulk Richardson number throughout a continuous range of the stable regime.

Negative feedback / positive feedback in SBL



Bifurcation diagram: Turbulence vs cooling rates.

Linear stability analysis: Stable/unstable equilibrium states

$$z/L < z/L|_M = \ln(z/z_0)/[2*\alpha*(1-z_0/z)]$$

Here z_0 is the momentum roughness length, and $\alpha=5$.

Hopf Bifurcation

A system with two coupled nonlinear ordinary differential equations:

$$\mathbf{dy}_1/\mathbf{dt} = \mathbf{f}_1(\mathbf{y}_1, \mathbf{y}_2, \lambda)$$

$$\mathbf{dy}_2/\mathbf{dt} = \mathbf{f}_2(\mathbf{y}_1, \mathbf{y}_2, \lambda)$$

$\lambda < \lambda_{\text{crit}}$: numerical stable;

$\lambda > \lambda_{\text{crit}}$: numerical unstable.

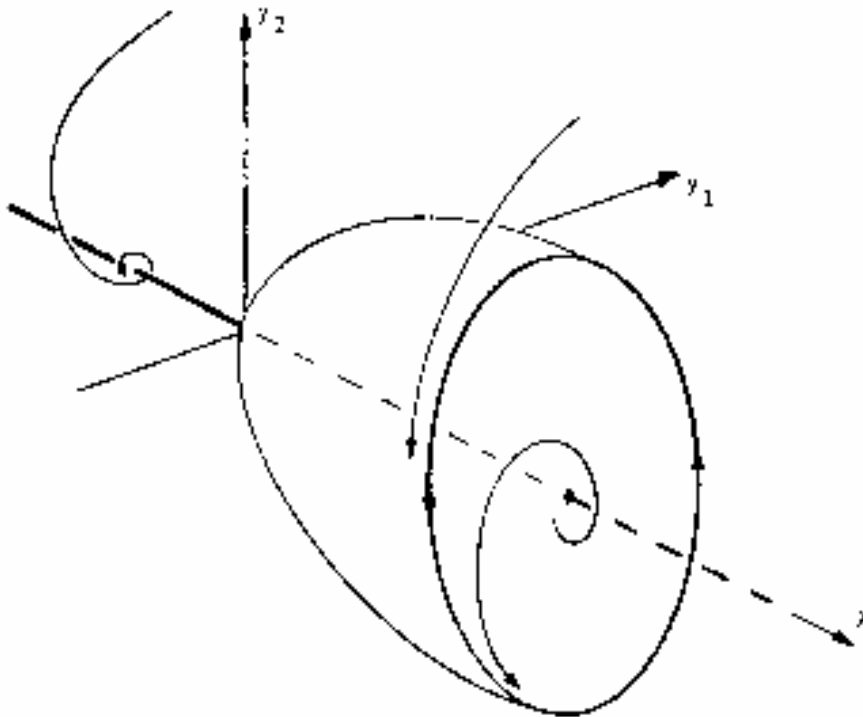
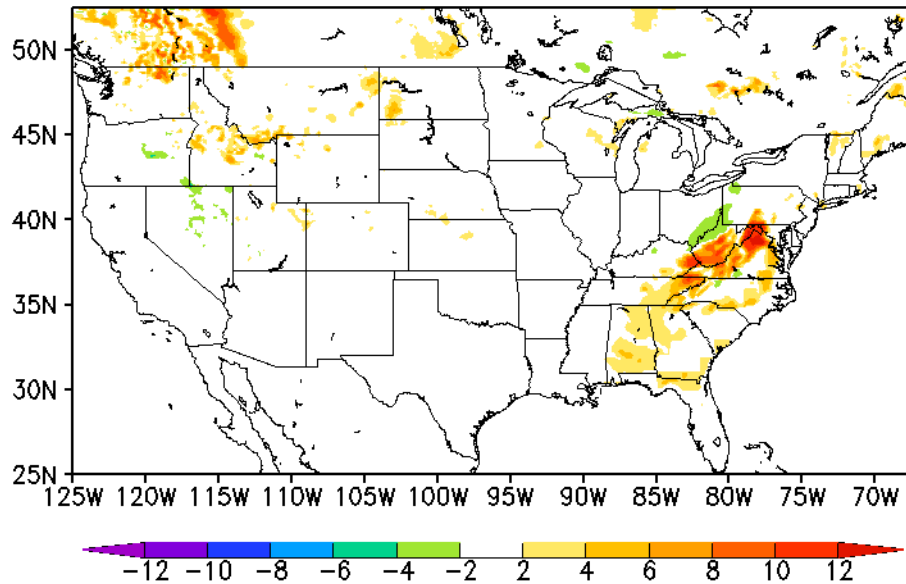


FIG. F1. Example of a Hopf bifurcation (see Seydel 1988). The limiting behavior from the trajectories near the equilibrium line change from a stable into a cyclic solution, when the critical value of a parameter λ_{crit} is passed (λ_{crit} is located at the intersect of the three axes).

Case 1: GFS Test: T2m

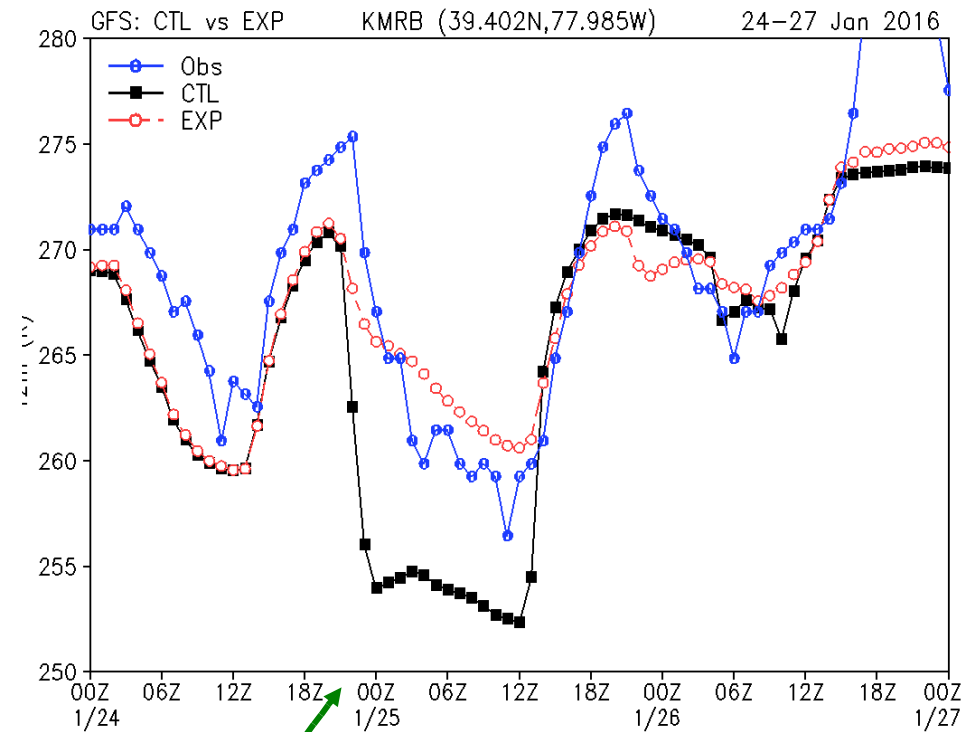
00Z, 2016-01-24 Cycle

GFS: EXP4-CTL: T2m (C) 00Z 25 Jan 2016



GFS Test: Increase T_{2m} and reduce cold bias

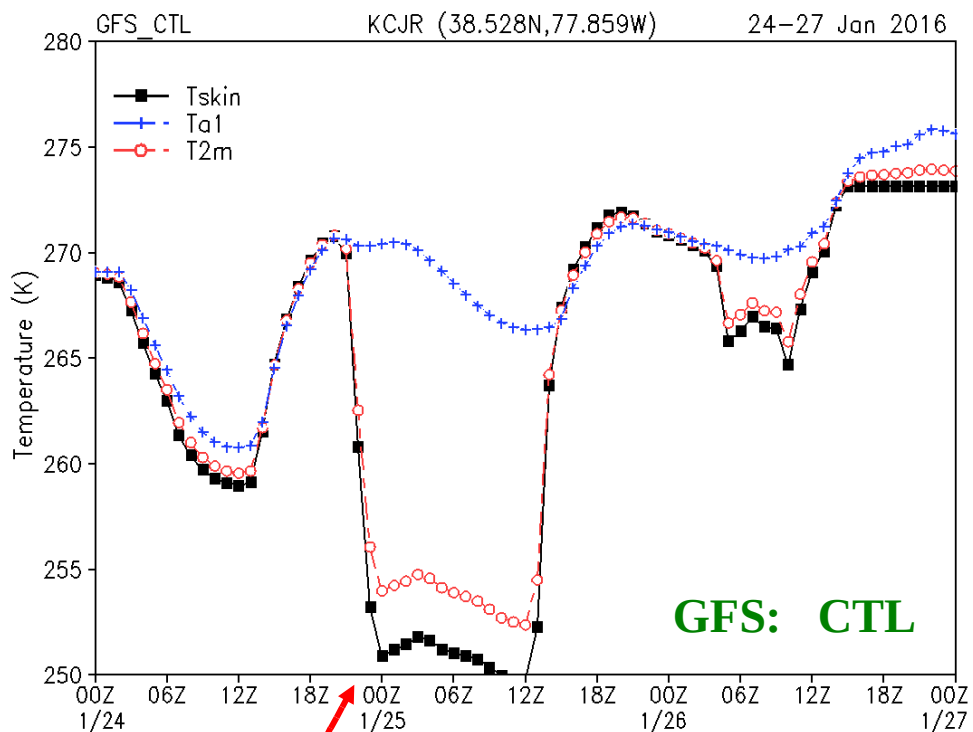
T2m @ MRB Matinsburg RGNL, WV



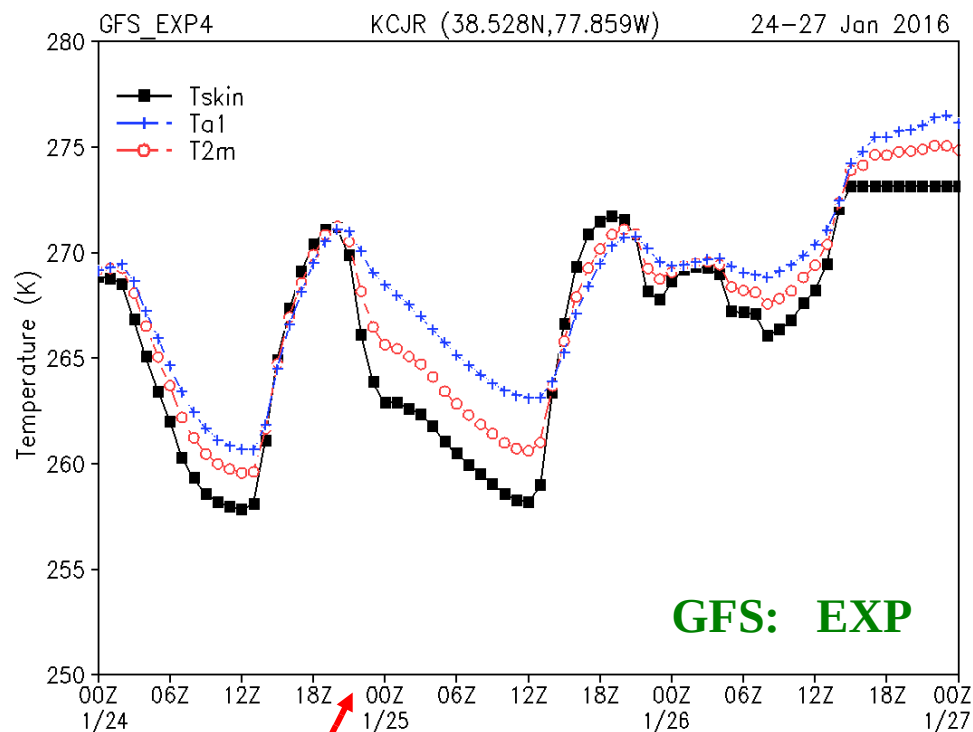
**CTL: Rapidly cooling more than 15 °C during 3hr;
EXP: Substantially improved**

GFS Test: T1, T2m and Tskin @ MRB

T1: Temperature at the lowest model level (Blue); T2m: Red; Tskin: Black



Rapidly cooling: Decoupled



Improvement

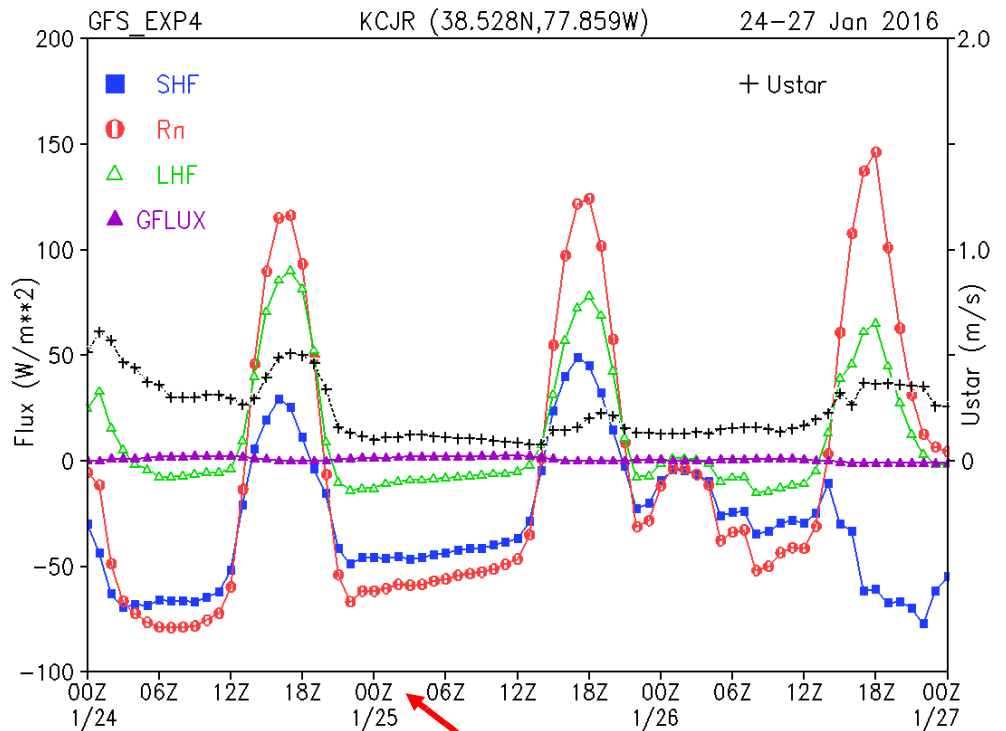
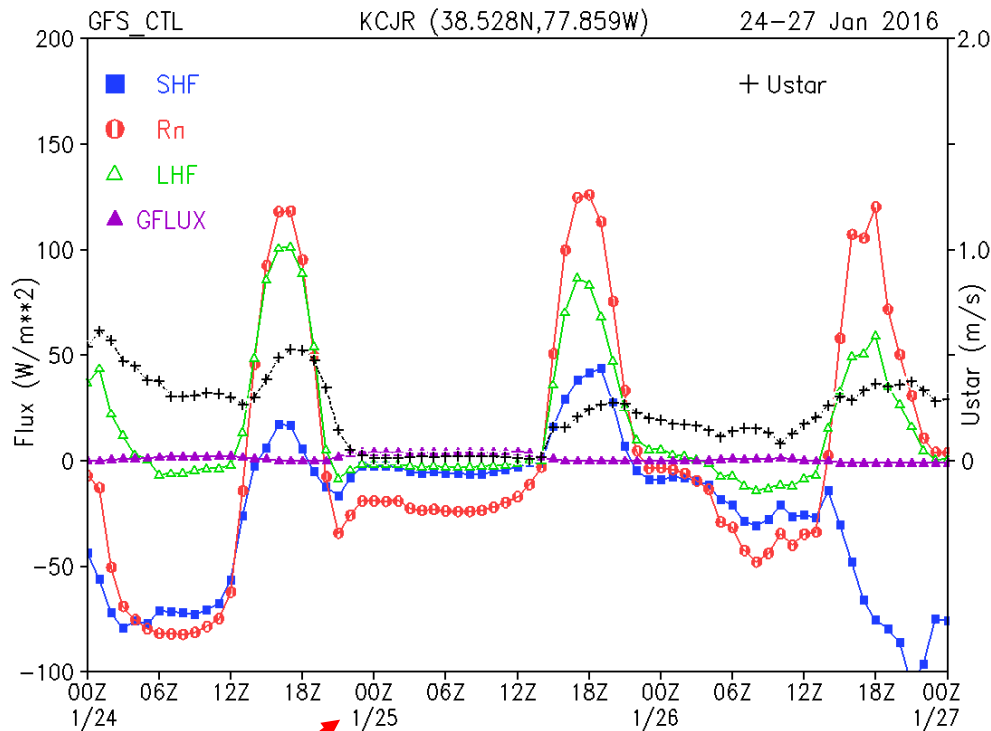
CTL: Large difference between T1 and T2m (or Tskin) during a period of nighttime on 1/25.

EXP: Substantially improved not only T2m, but also Tskin and T1.

GFS Test: Surface Fluxes and Ustar @ MRB

GFS: CTL

GFS: Test



Under weak turbulence

Cessation of turbulence: SHF, Ustar \rightarrow 0

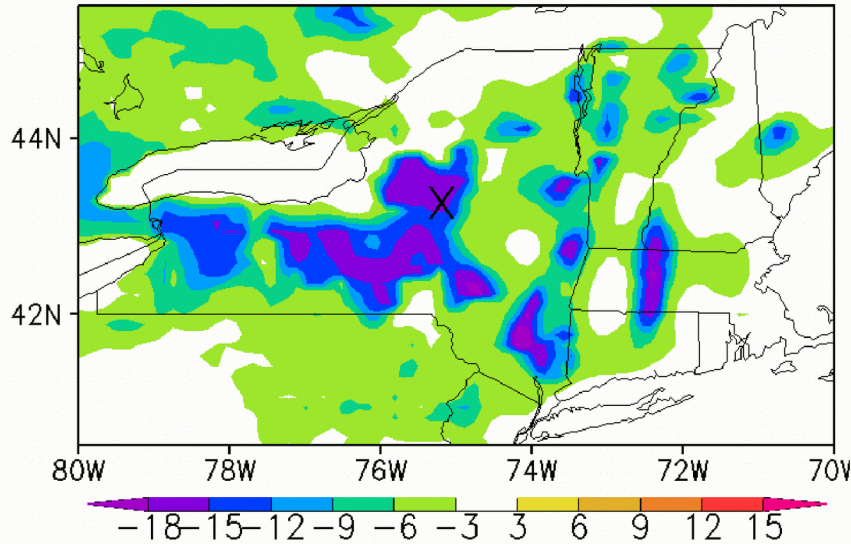
SHF: Sensible heat flux; Rn: Net downward radiation;
LHF: Latent heat flux; GFLUX: Soil heat flux;

Ustar: Friction velocity

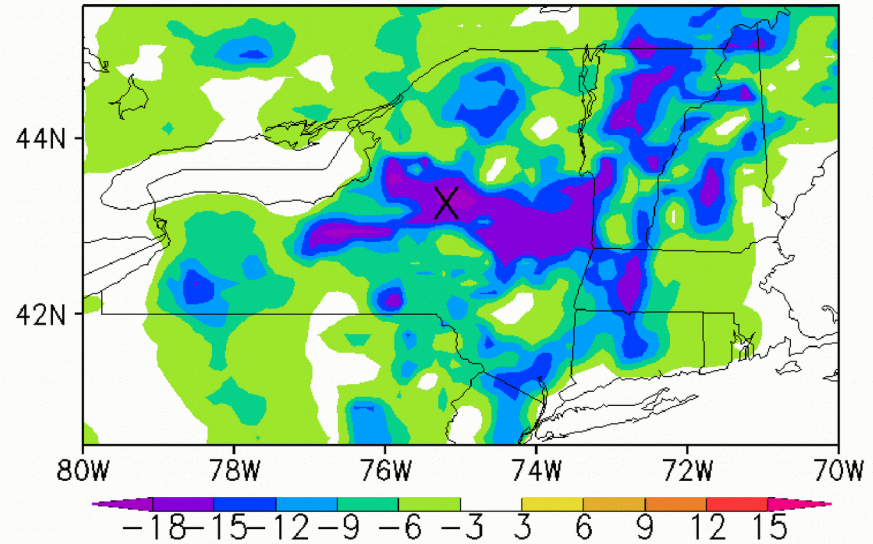
Case 2: GFS Test: T2m

00Z, 2015-02-16 Cycle

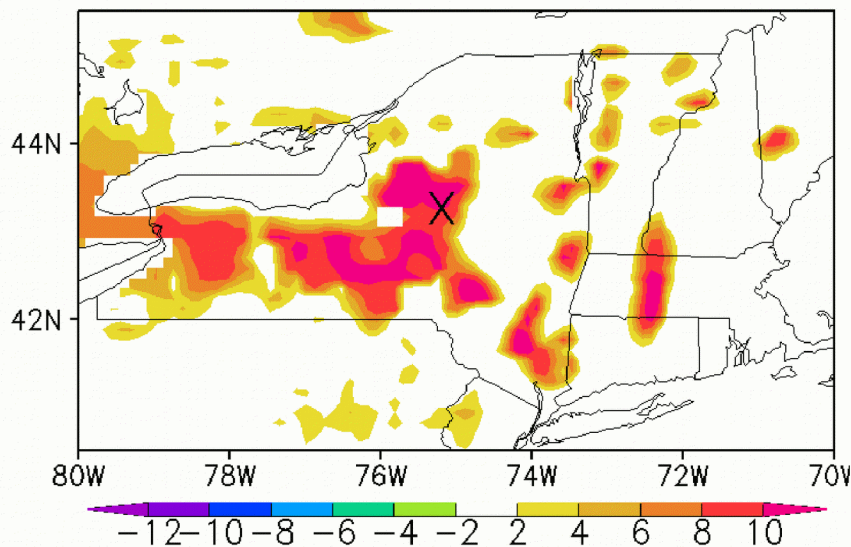
(a) GFS_CTL: Delt(T2m)/3hr 00Z 17 Feb 2015



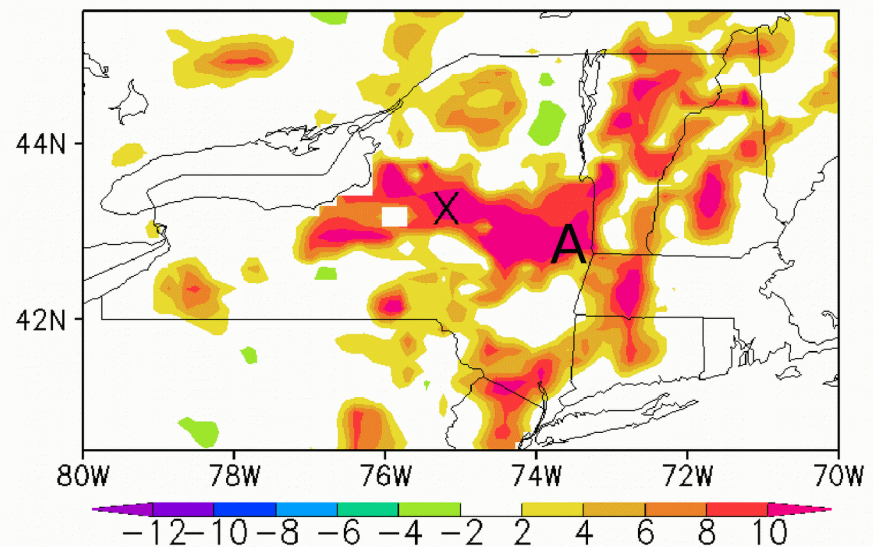
(b) GFS_CTL: Delt(T2m)/3hr 00Z 18 Feb 2015



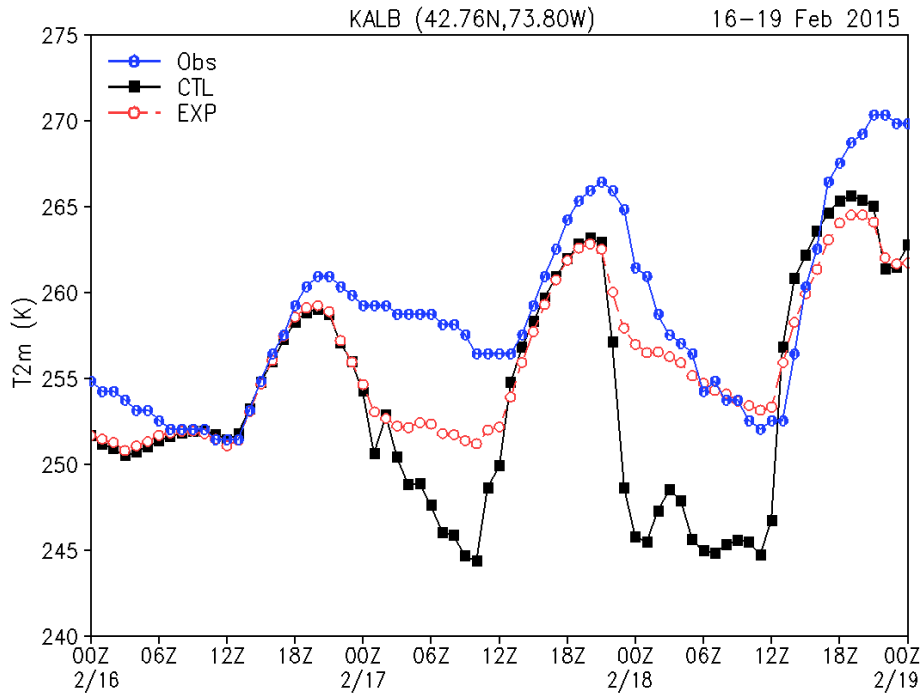
(c) GFS: EXP5-CTL: T2m (C) 00Z 17 Feb 2015



(d) GFS: EXP5-CTL: T2m (C) 00Z 18 Feb 2015



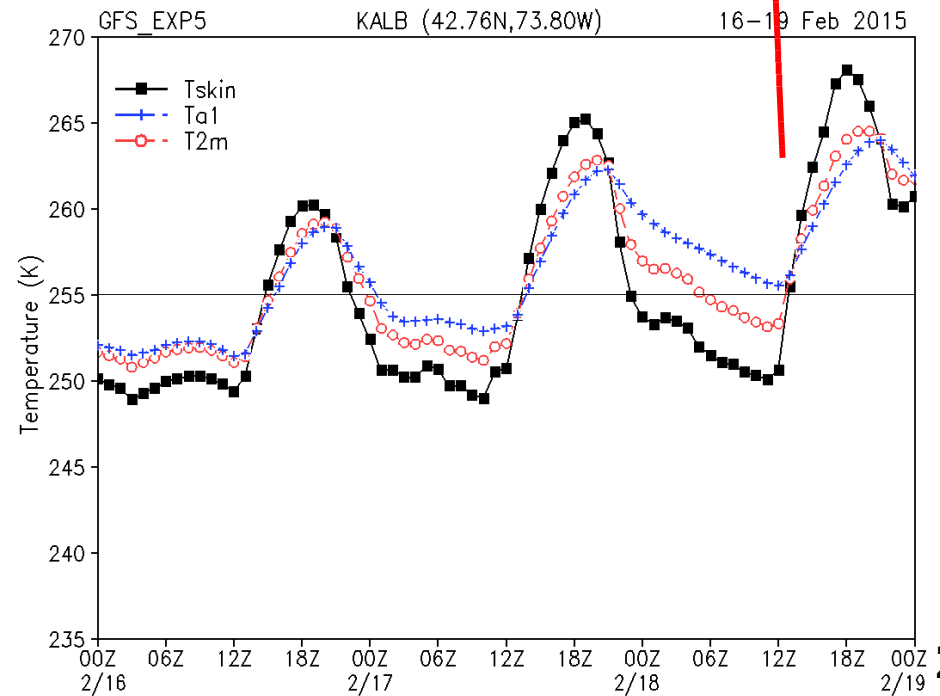
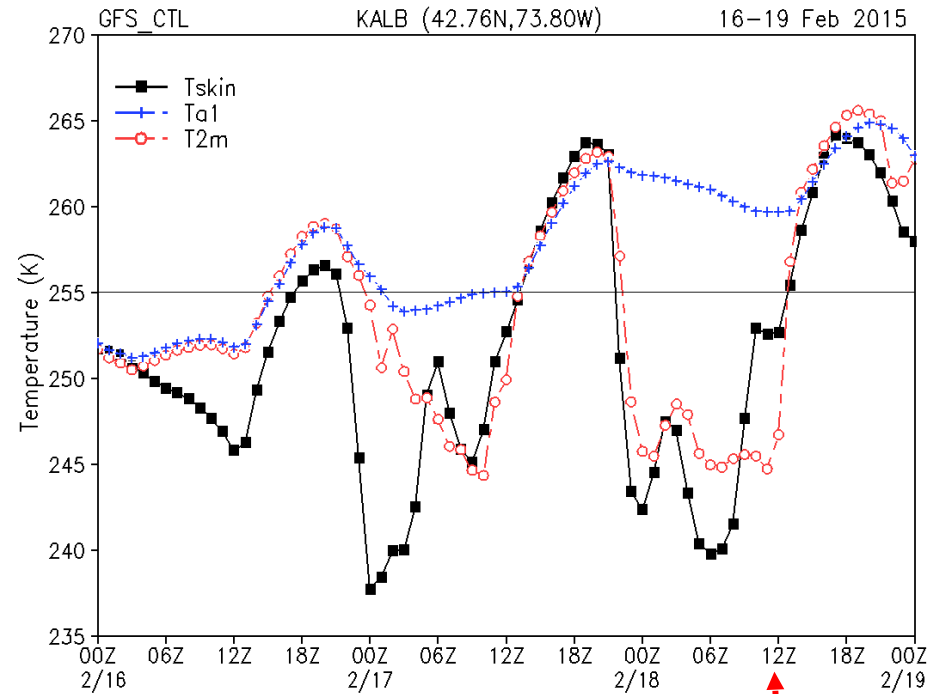
GFS Test: T1, T2m and Tskin @ KALB



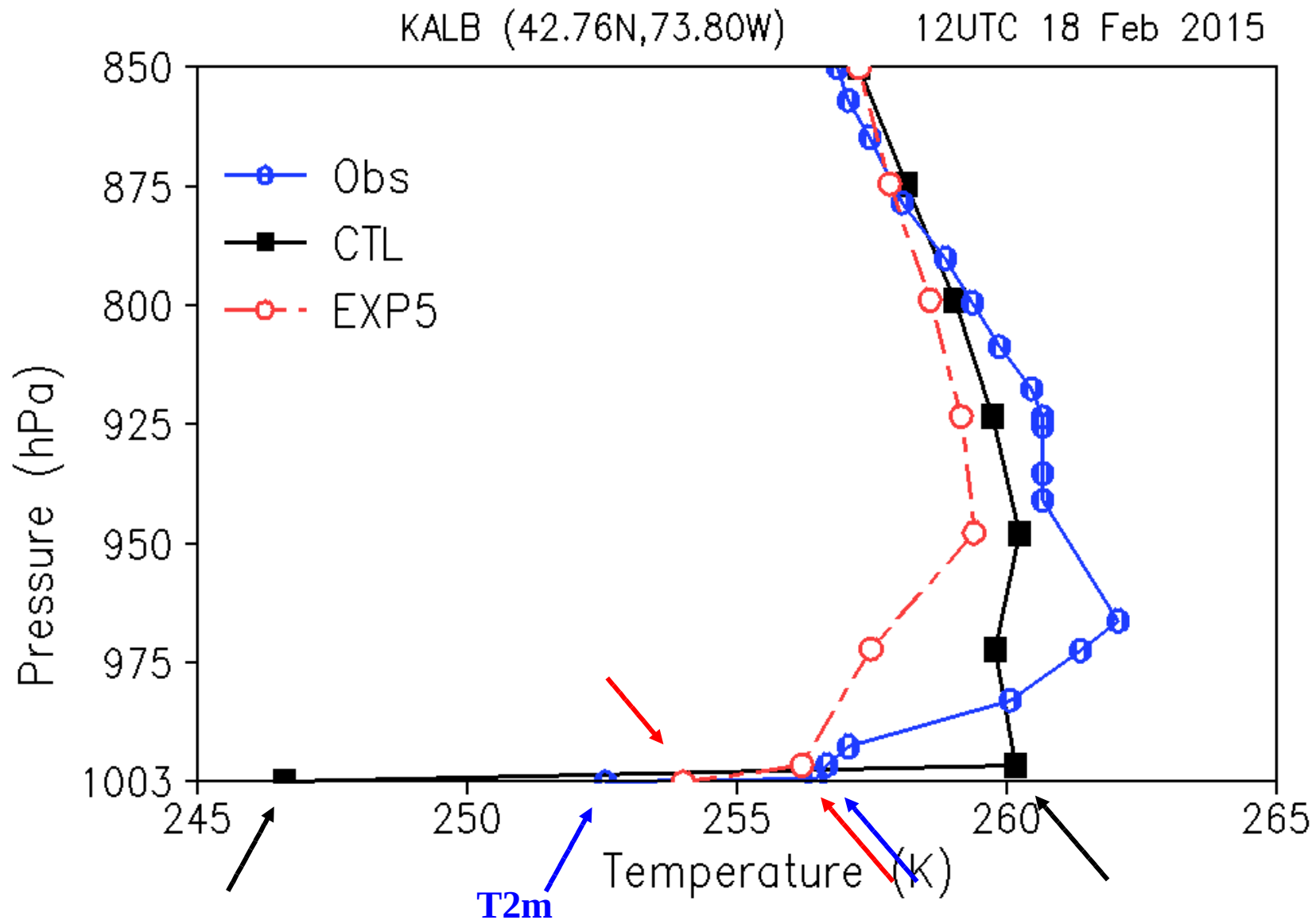
Rapidly cooling: Decoupled

CTL: Large difference between T1 and T2m (or Tskin) during a period of nighttime on 1/25.

EXP: Substantially improved not only T2m, but also Tskin and T1.



GFS Test: Temperature profiles @ KALB

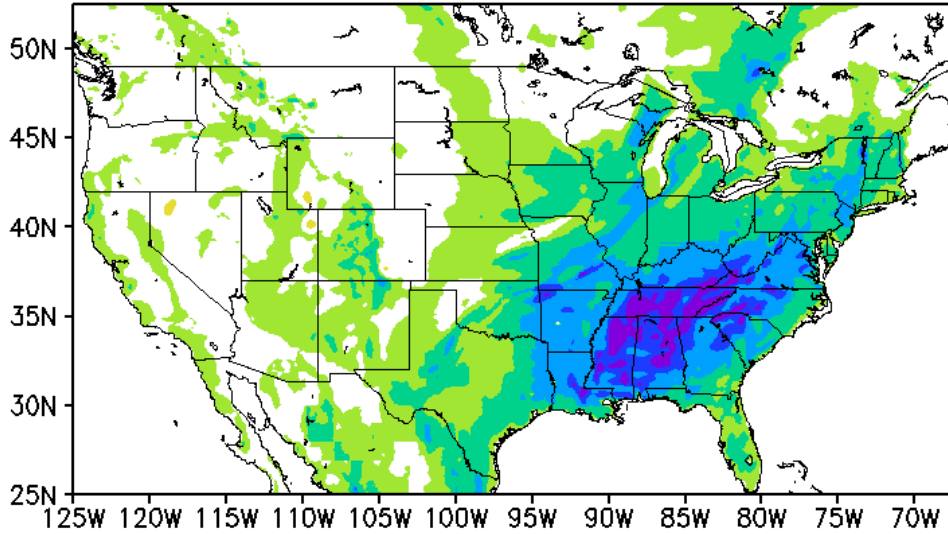


CTL: Little downward heat transport (atmos-->land) during the night decoupling period results in accumulation of excess heat and as a result, the warm bias exists above the first model level.

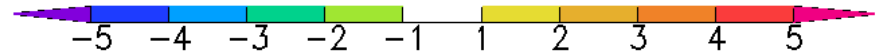
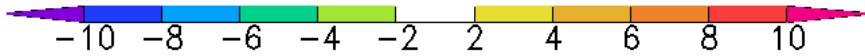
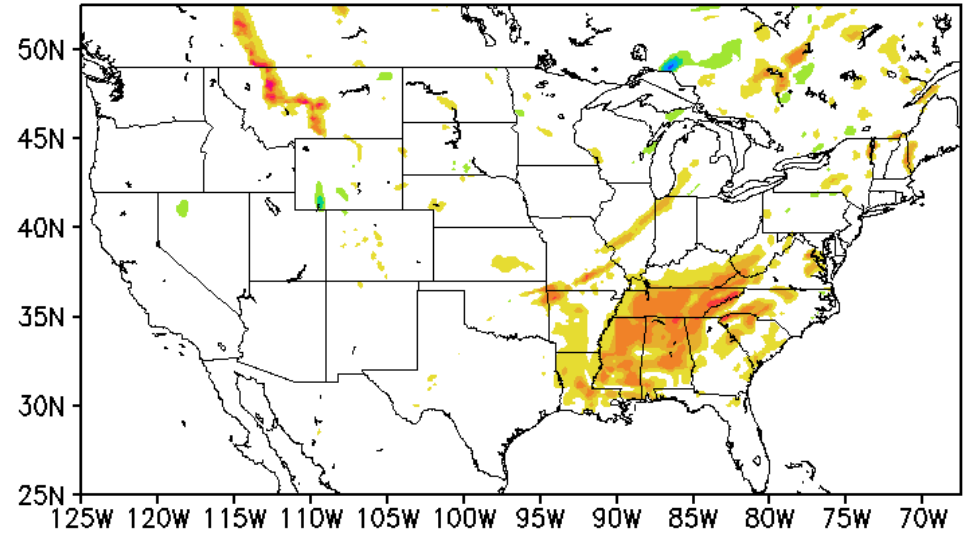
Case 3: GFS Test: T2m

00Z, 2012-10-05 Cycle

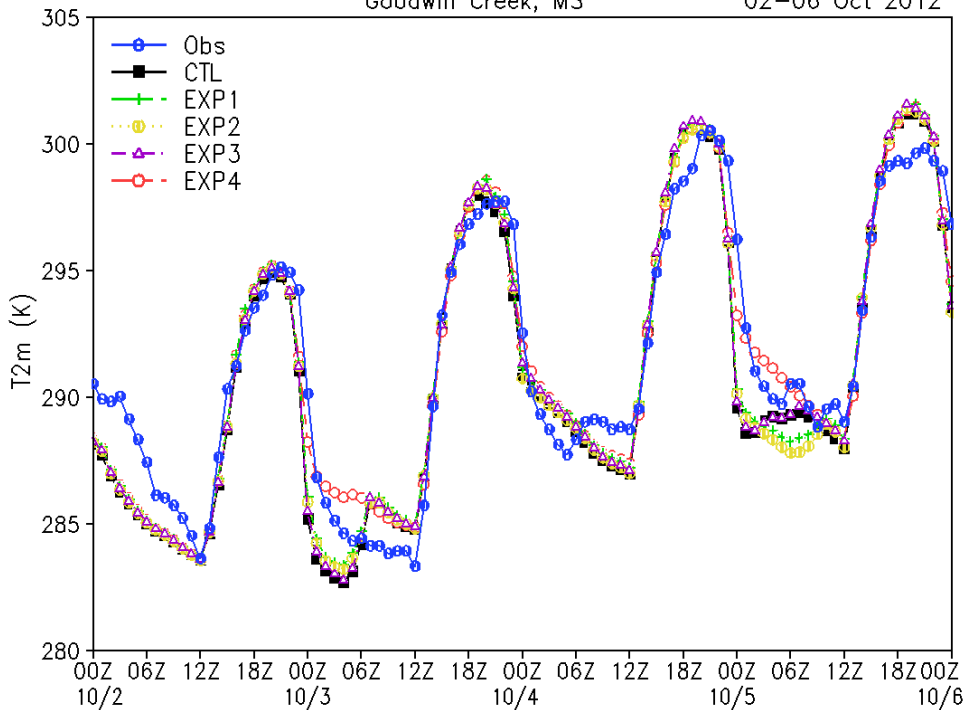
GFS_CTL: Delt(T2m)/3hr 00Z 05 Oct 2012



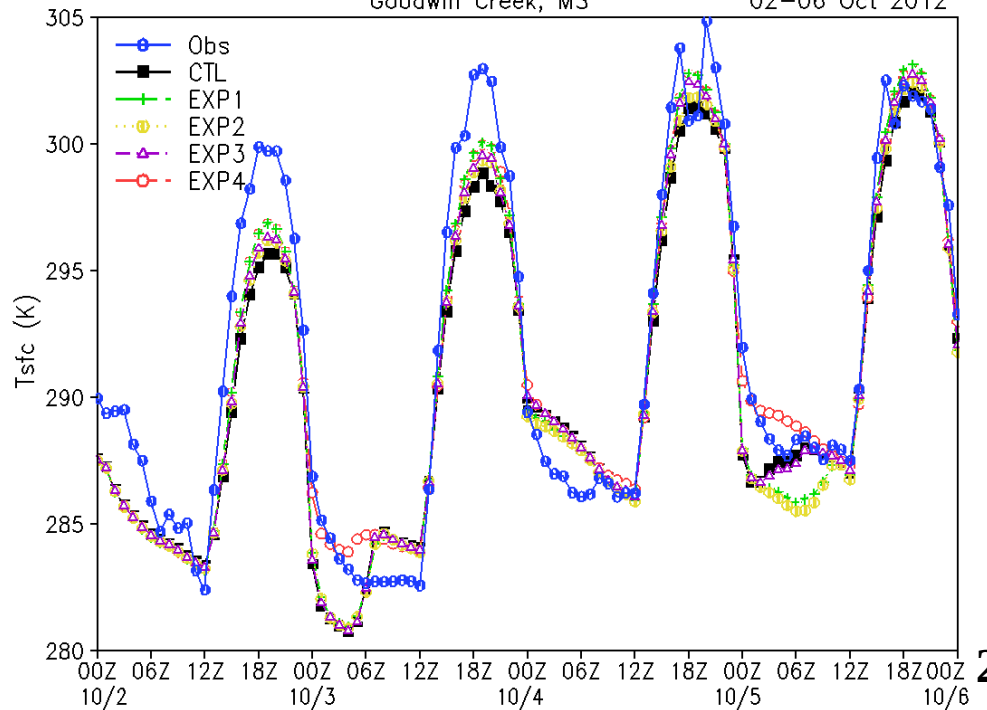
GFS: EXP4-CTL: T2m (C) 00Z 05 Oct 2012



Goodwin Creek, MS 02-06 Oct 2012



Goodwin Creek, MS 02-06 Oct 2012



GFS Test: Autumn season

***GFS:* T1534; Free forecast at each 00Z cycle**

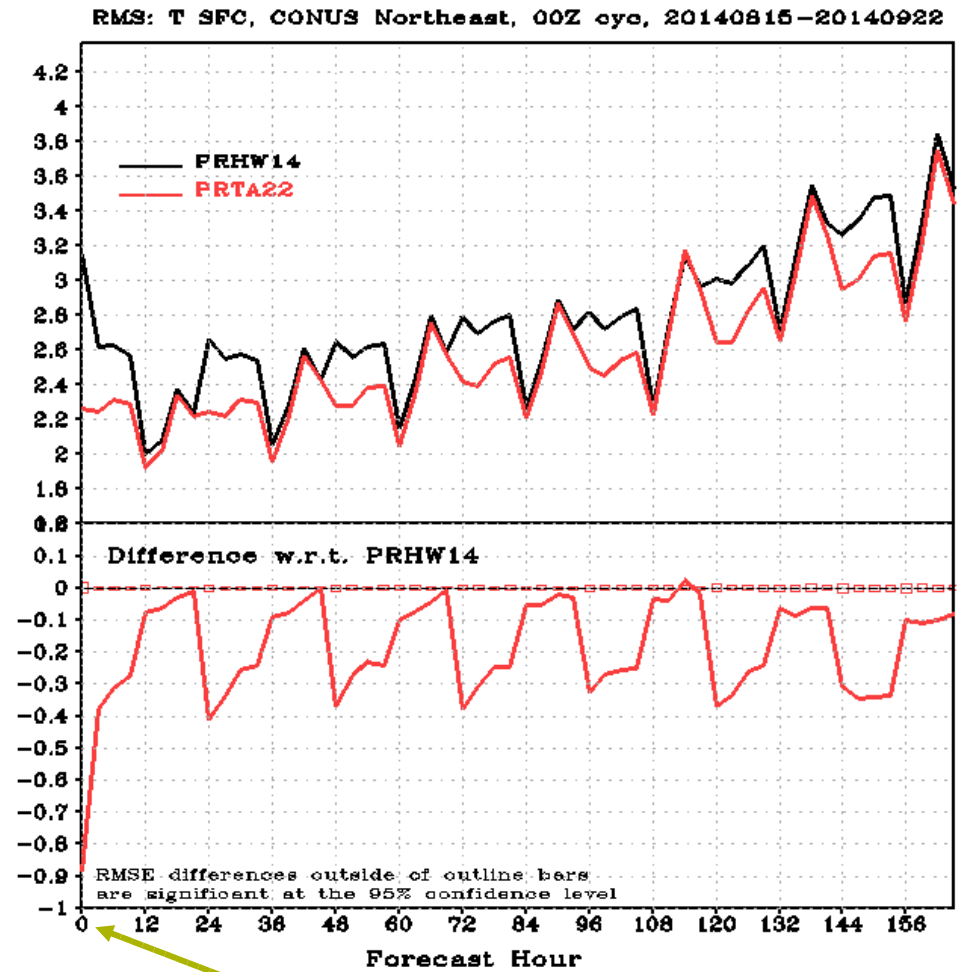
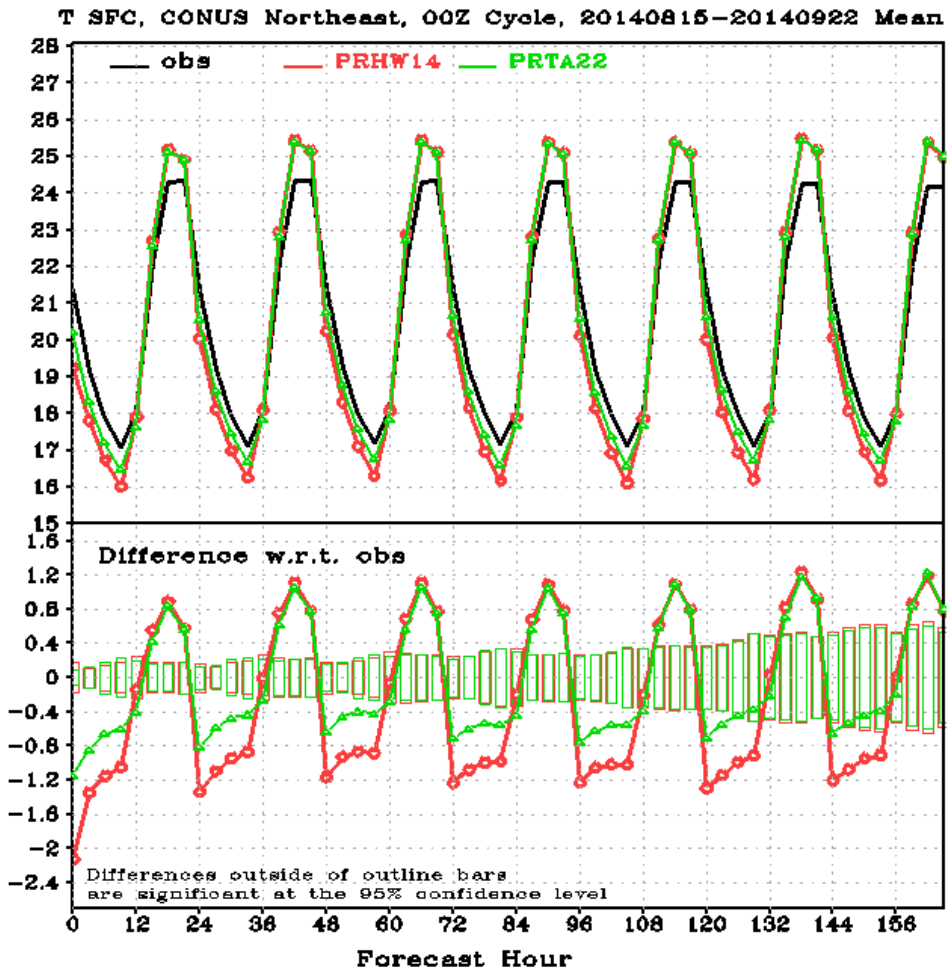
***Case:* Aug.15 – Sep.22, 2014**

There are several cases for T_{2m} rapidly cooling late afternoon

***Results:* prhw14 vs prta22 (test)**

Surface temperature and its RMSE

Northeast

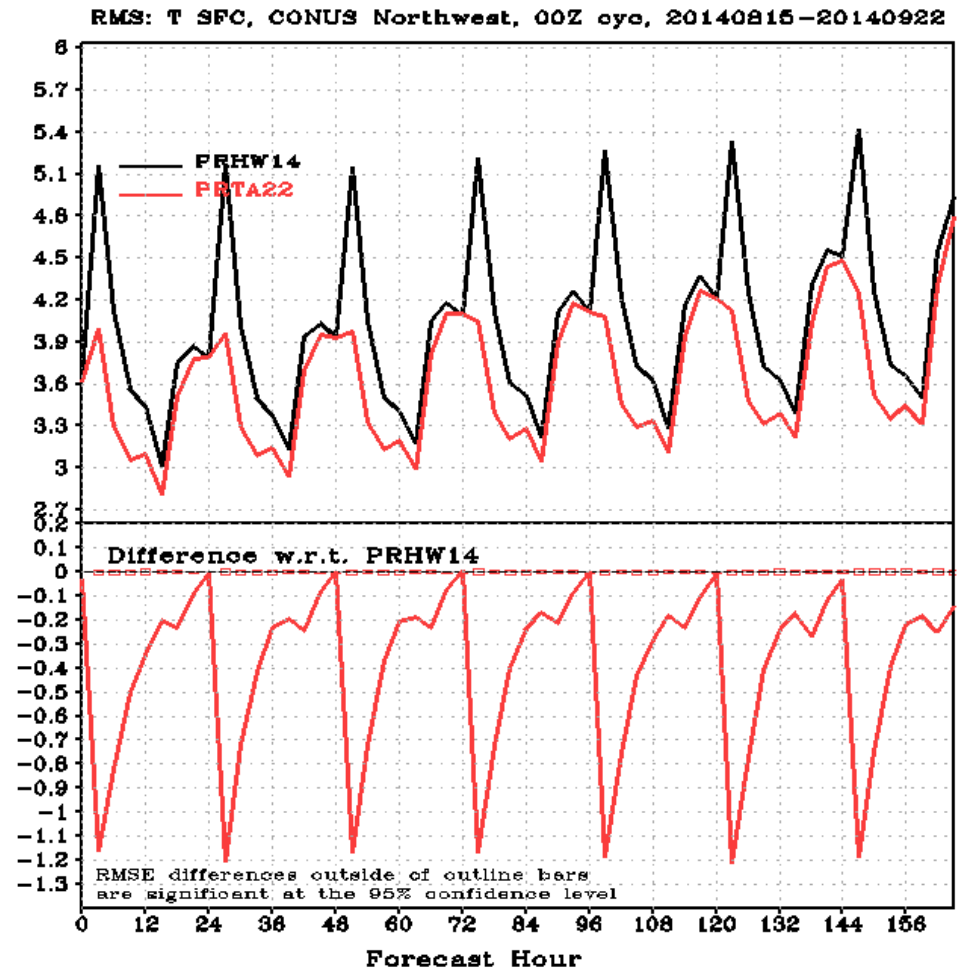
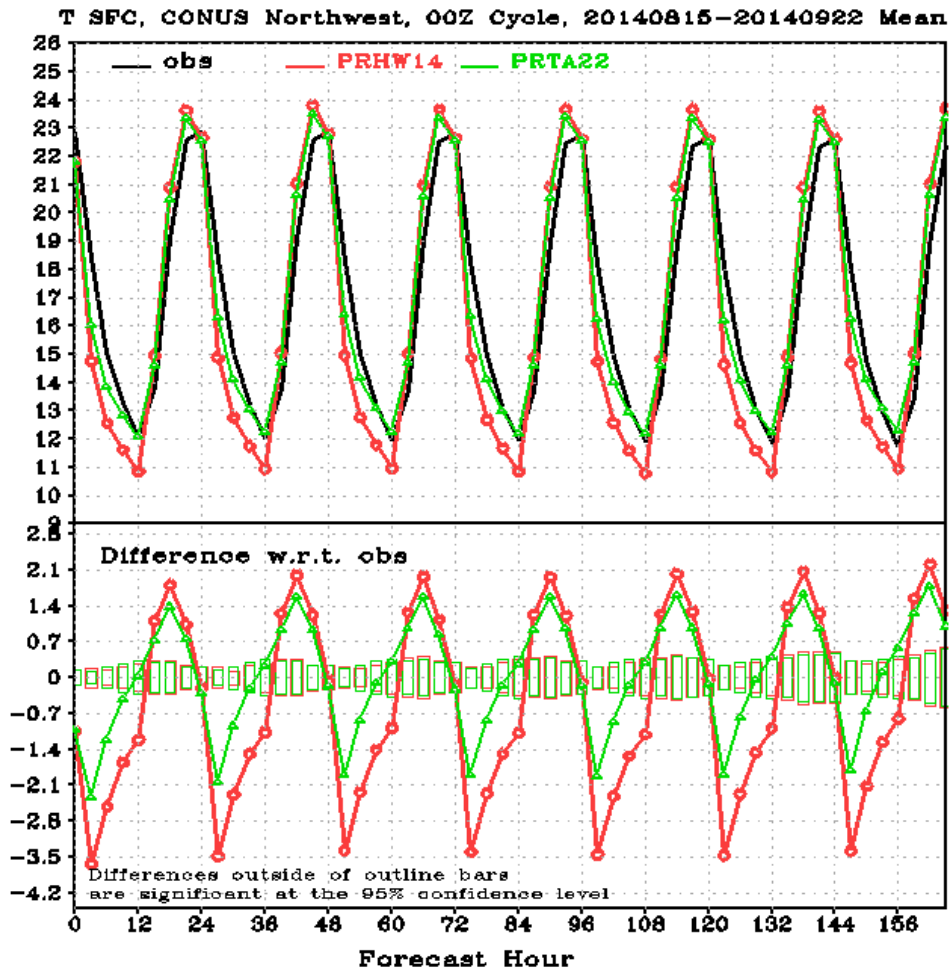


T2m at t=0 ?

Reduced cold bias and RMSE afternoon and nighttime (~0.5 °C)

Surface temperature and its RMSE

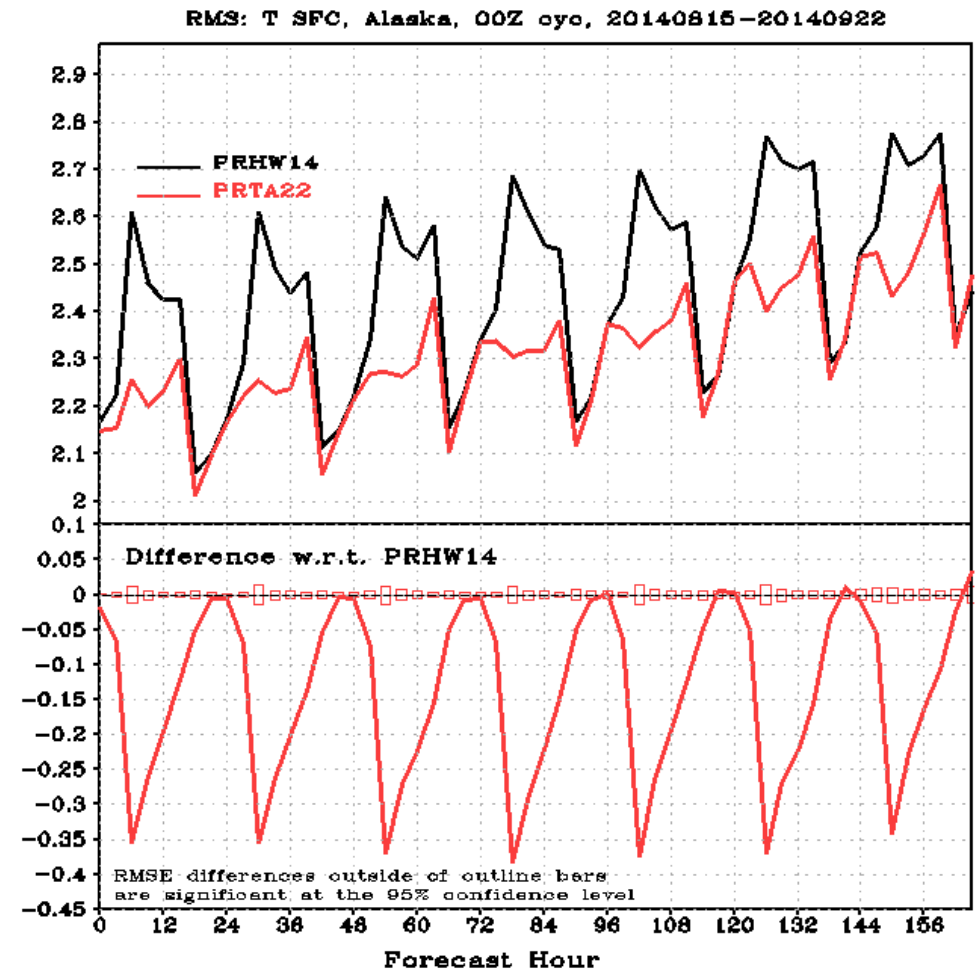
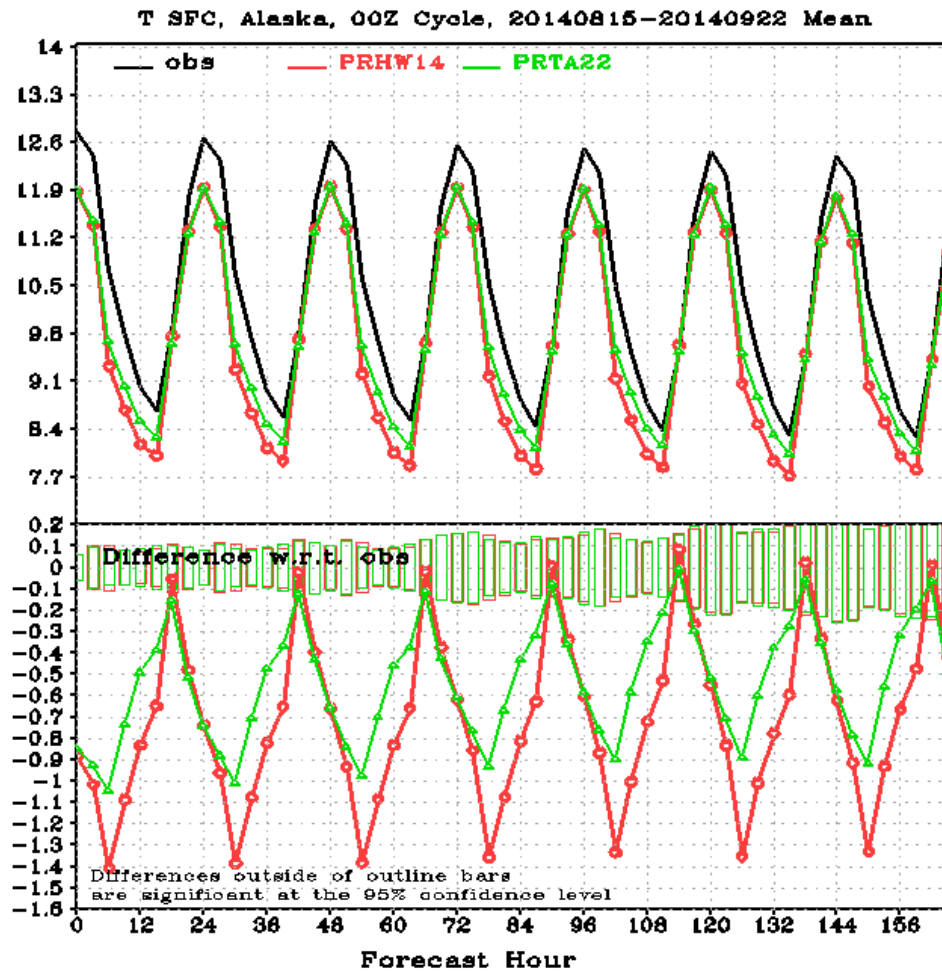
Northwest



*Reduced warm bias in the morning and cold bias in the afternoon (1.5 °C);
Reduced RMSE afternoon and nighttime up to 1.2 °C .*

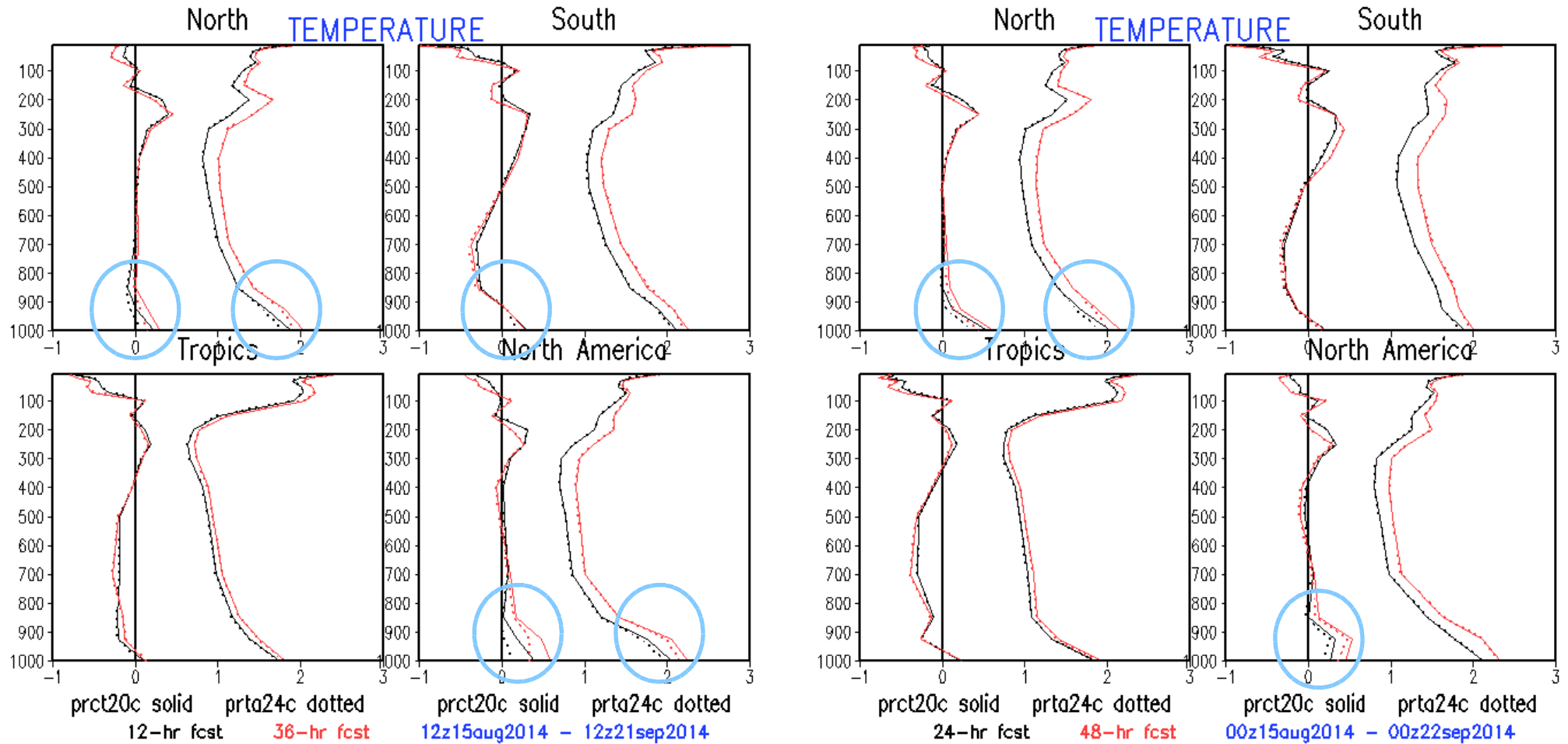
Surface temperature and its RMSE

Alaska



Reduced cold bias and RMSE afternoon and nighttime (~ 0.4 °C)

Autumn: Temperature fits to Obs: Bias and RMSE



12/36-hr fcst

24/48-hr fcst

Reduced temperature bias and RMSE near the surface in North America

GFS Test: Winter season

***GFS:* T1534; Free forecast at each 00Z cycle**

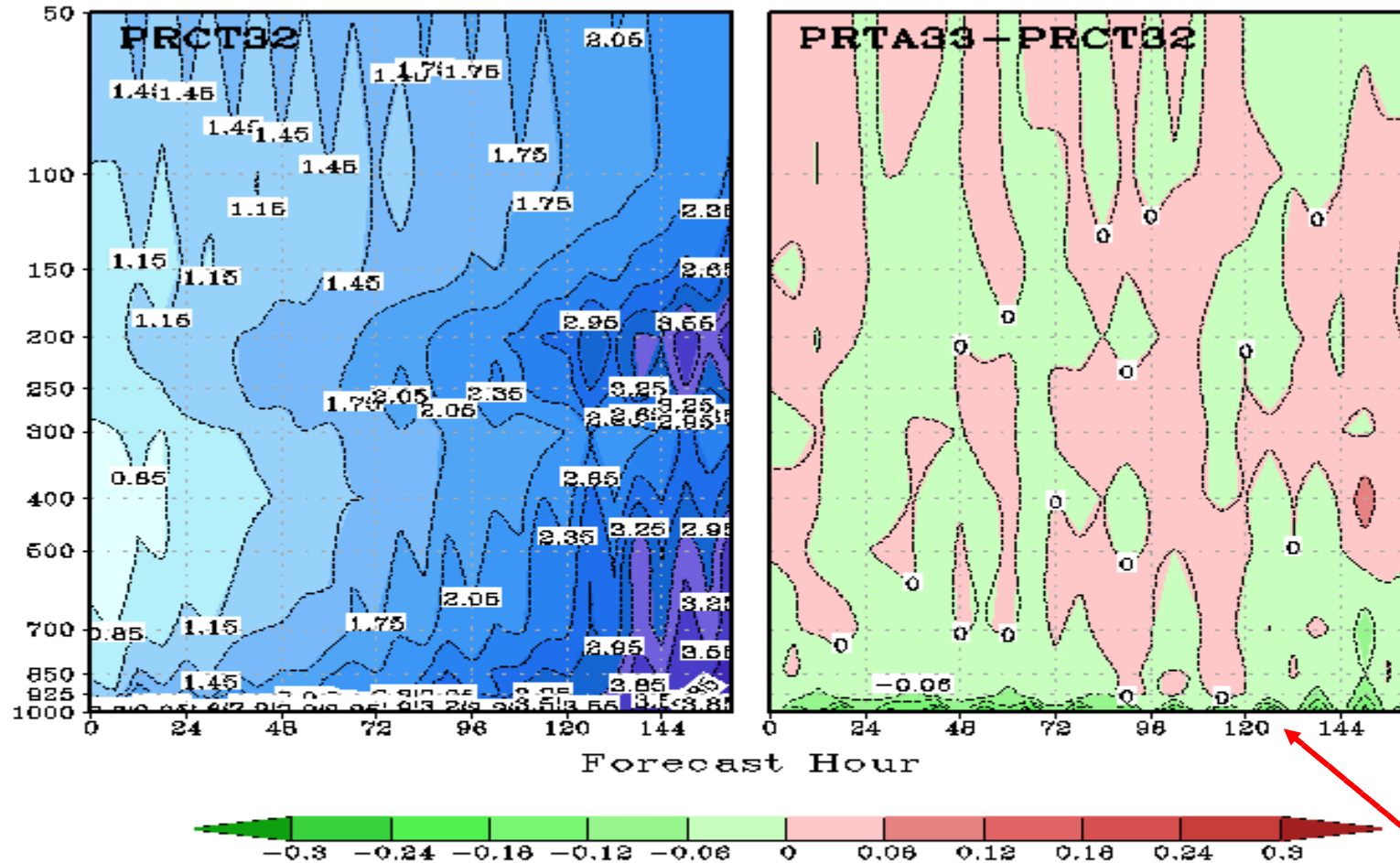
***Cases:* Jan.21 – Mar.02, 2015; Winter season**

There are several cases for T_{2m} rapidly cooling late afternoon

***Results:* prct32 (CTL) and prta33 (EXP)**

Temperature fits to Obs: RMSE Global

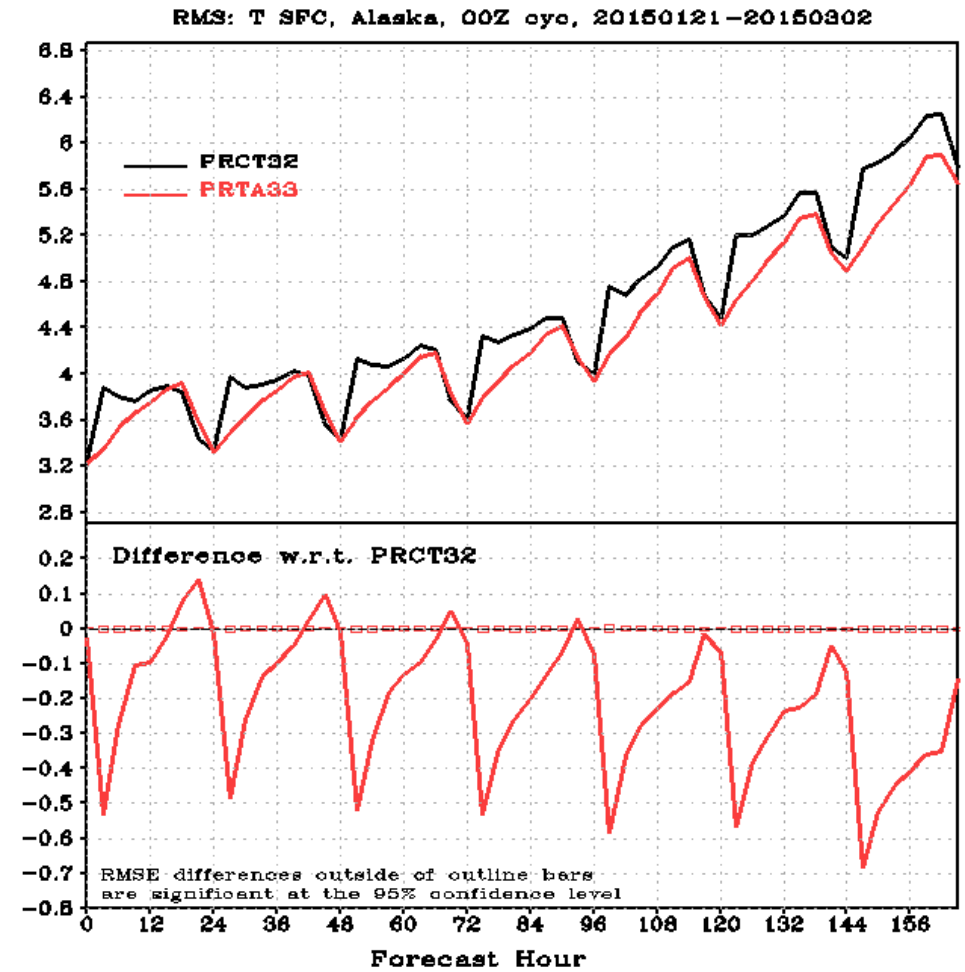
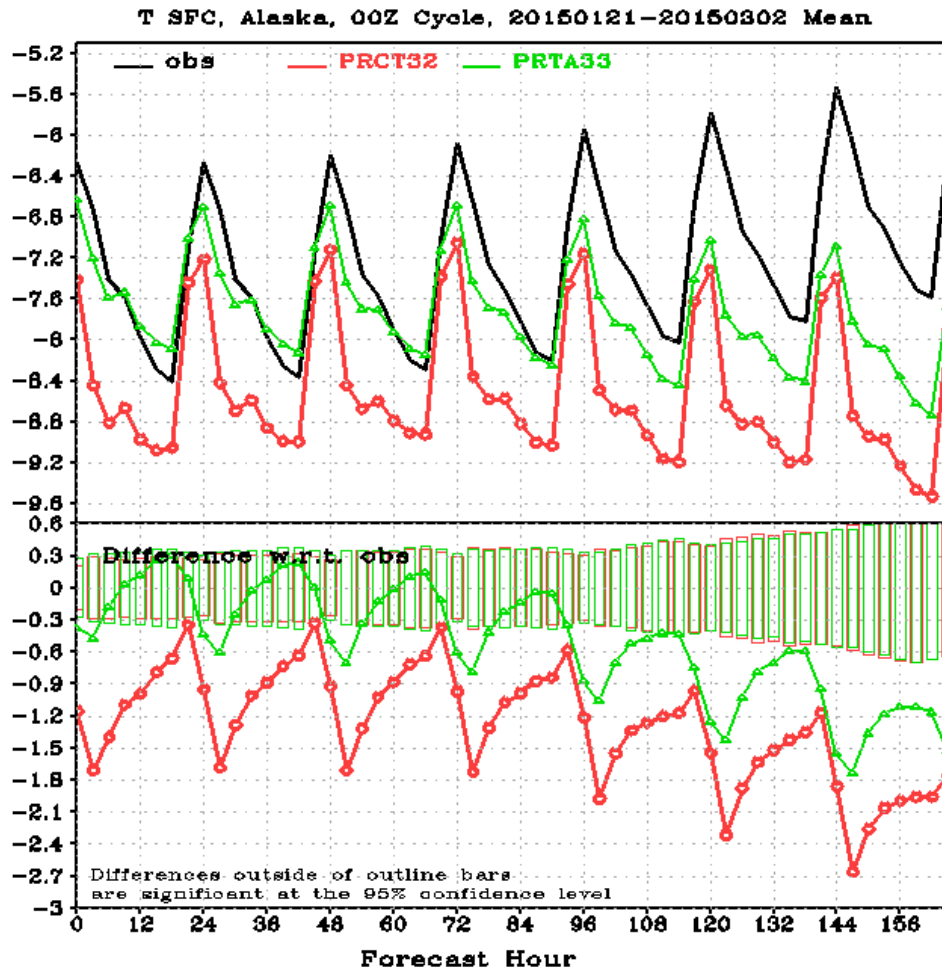
T (K) RMSE over Globe: fit to ADPUPA
00Z Cycle 20150121-20150302 Mean



Reduced RMSE near the surface

Surface temperature and its RMSE

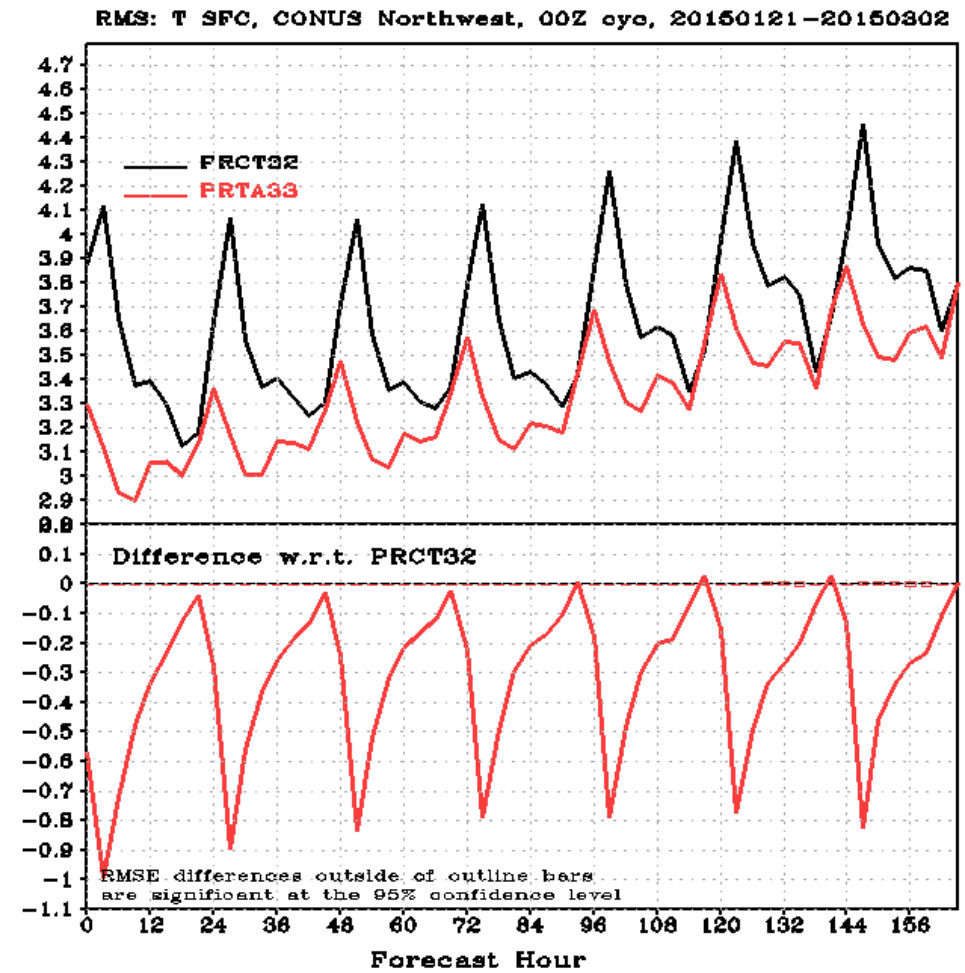
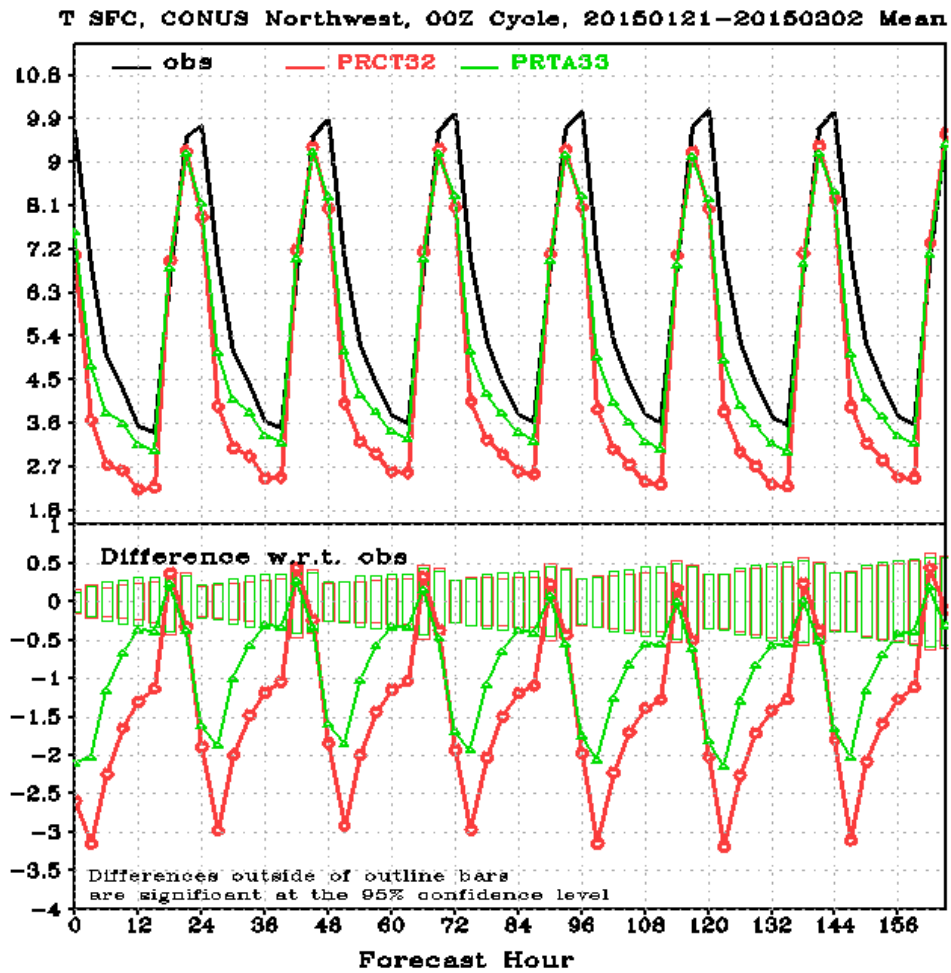
Alaska



Reduced cold bias (~1 °C) and RMSE (~0.5 °C) afternoon and nighttime.

Surface temperature and its RMSE

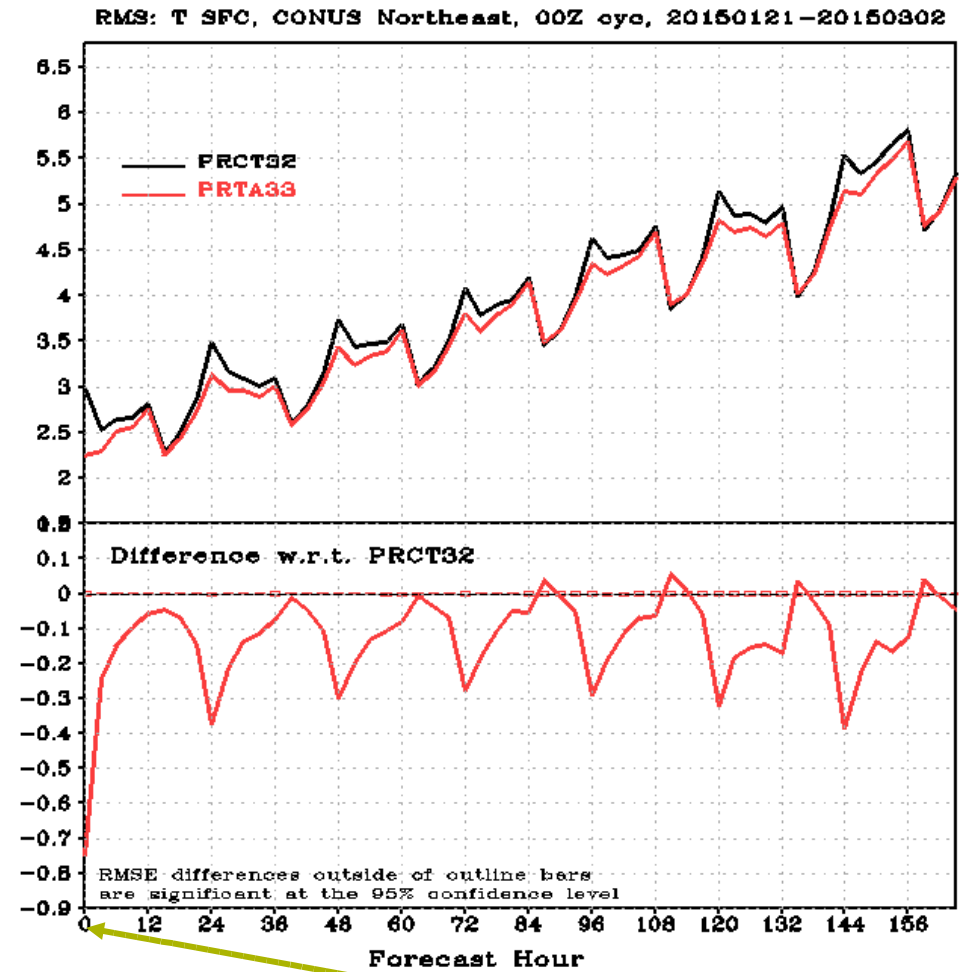
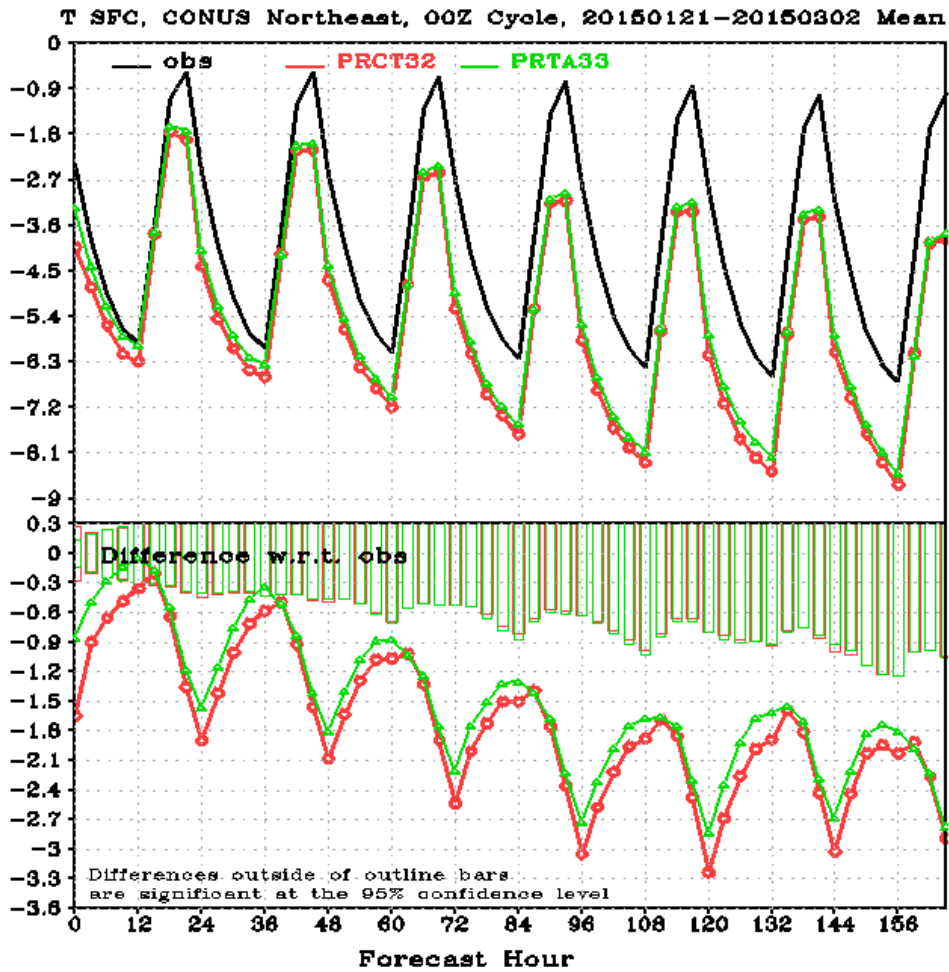
Northwest



*Reduced cold bias afternoon and nighttime (~ 1.2 °C);
Reduced RMSE afternoon and nighttime up to 1.0 °C ($\sim 25\%$ RMSE).*

Surface temperature and its RMSE

Northeast

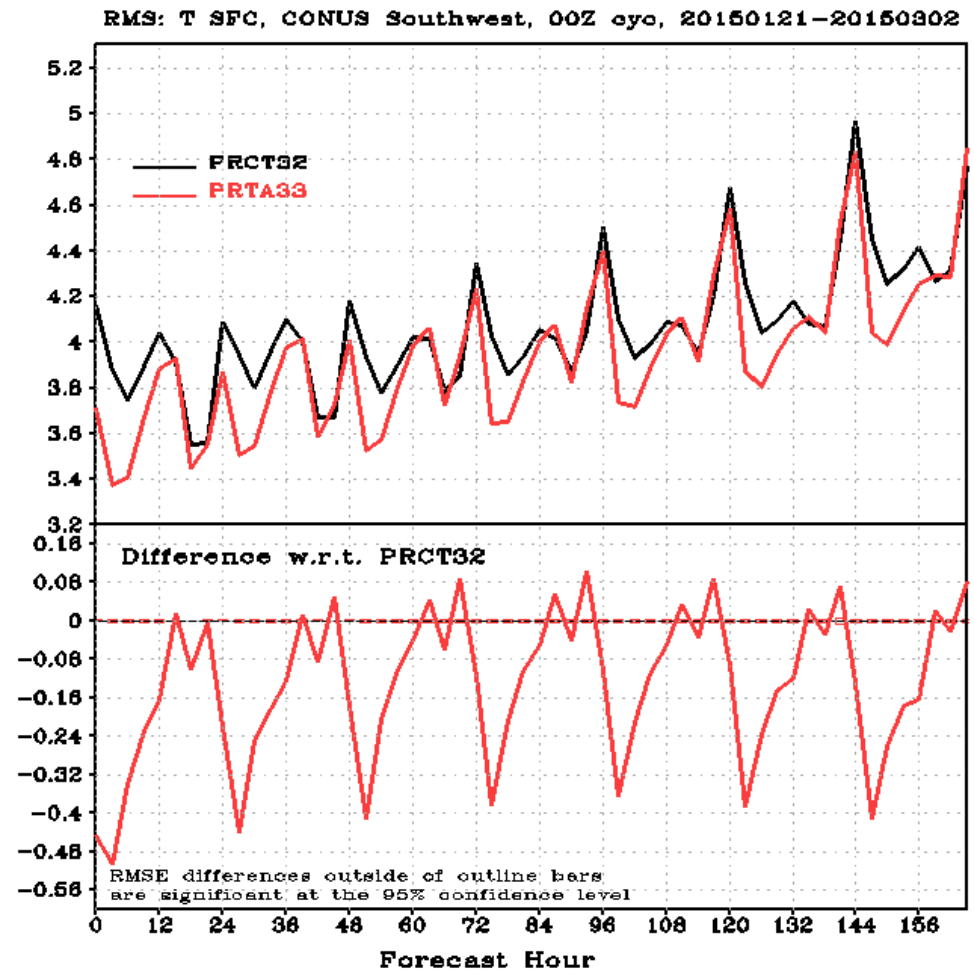
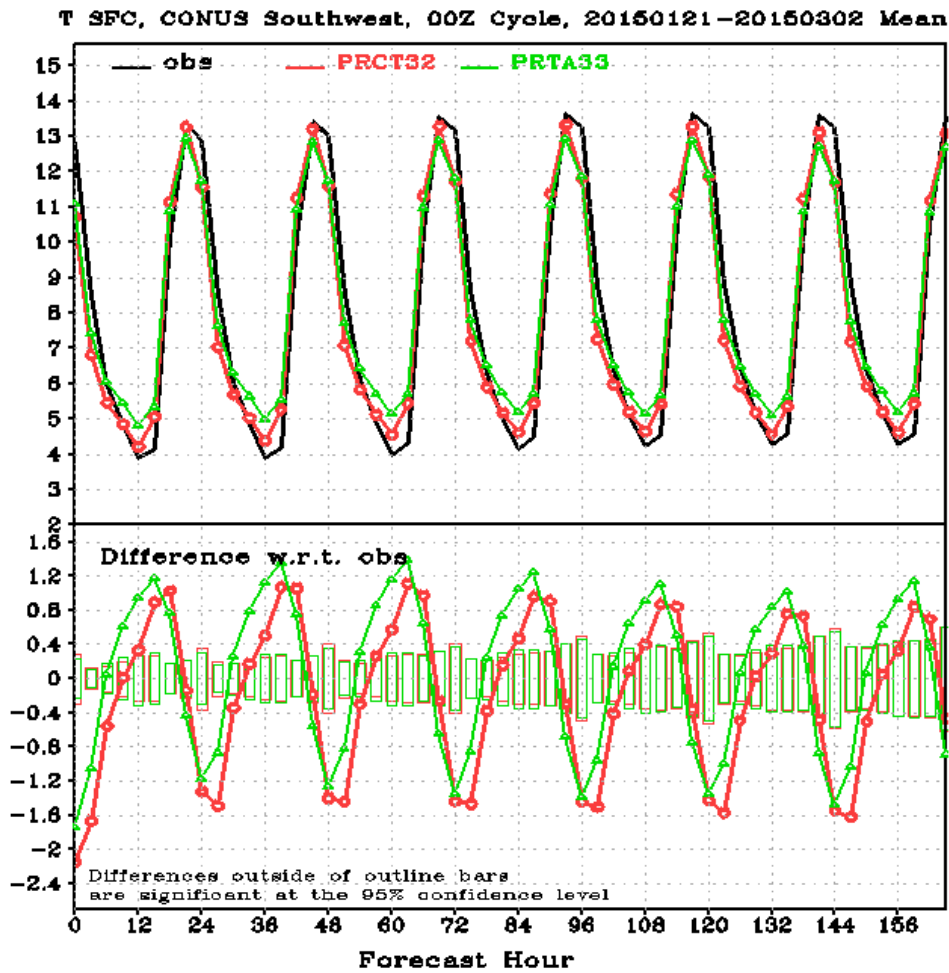


T2m at t=0 ?

*Reduced cold bias and RMSE afternoon and nighttime (~ 0.5 °C)
New land data sets (e.g., snow albedo) can reduce this kind of errors (cold trend).*

Surface temperature and its RMSE

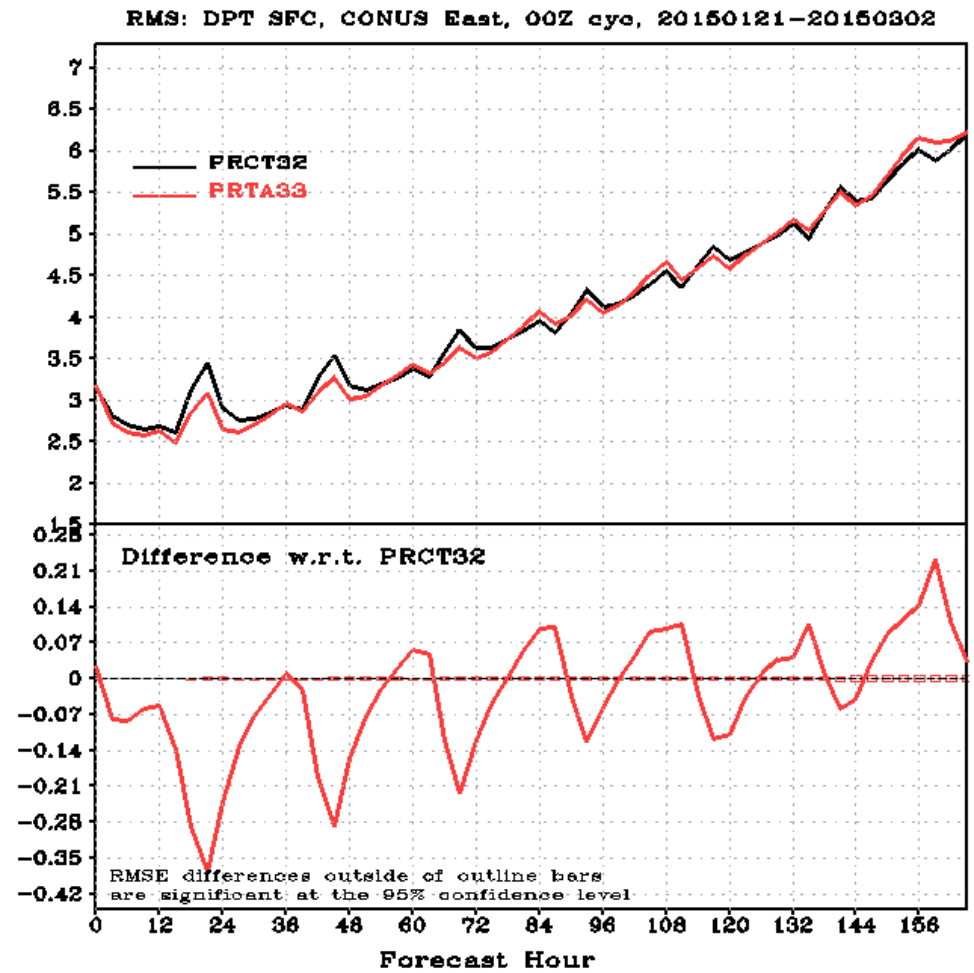
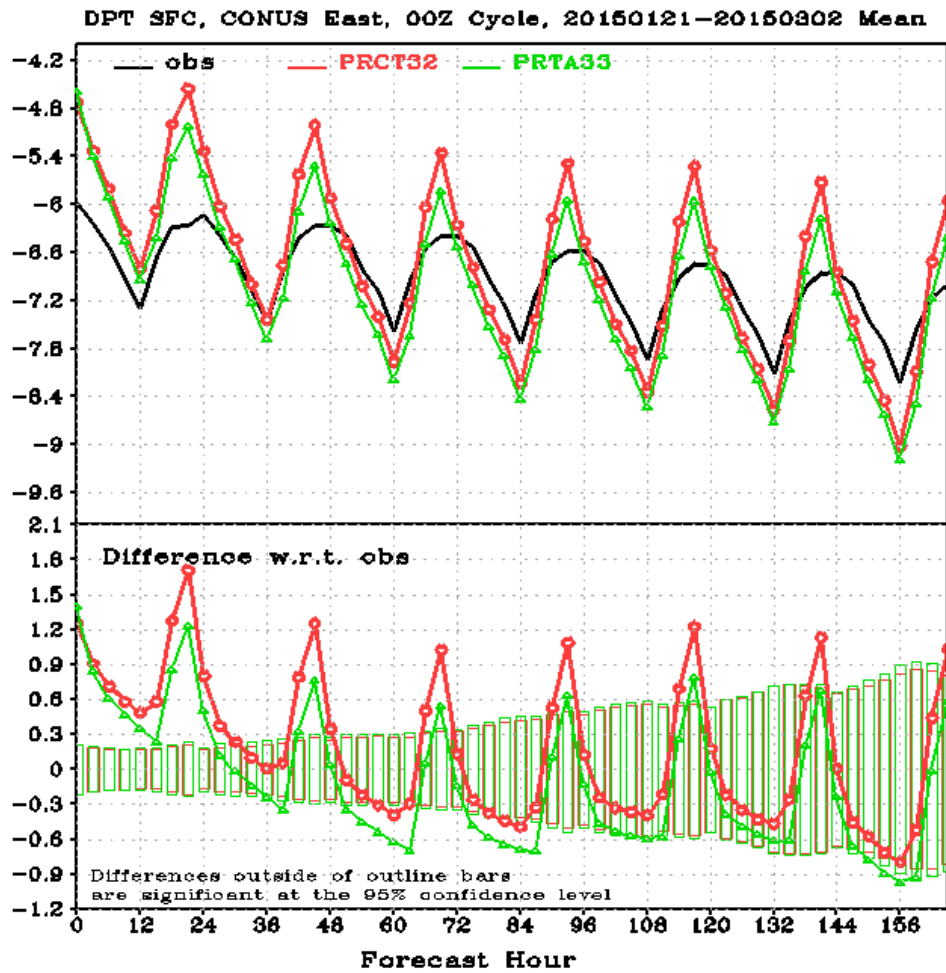
Southwest



*Reduced cold bias afternoon but got a little warm bias during nighttime;
Reduced RMSE afternoon and nighttime up to 0.4 °C (~ 10% RMSE).*

Surface dew point temp and its RMSE

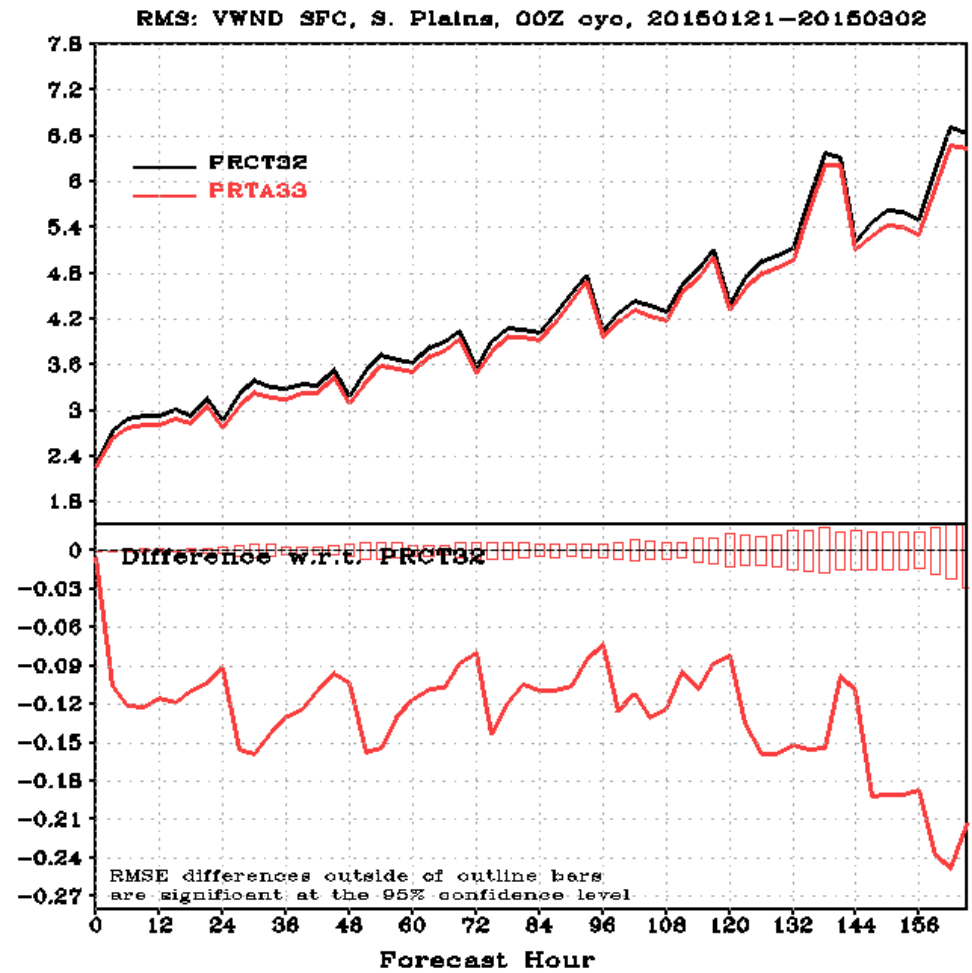
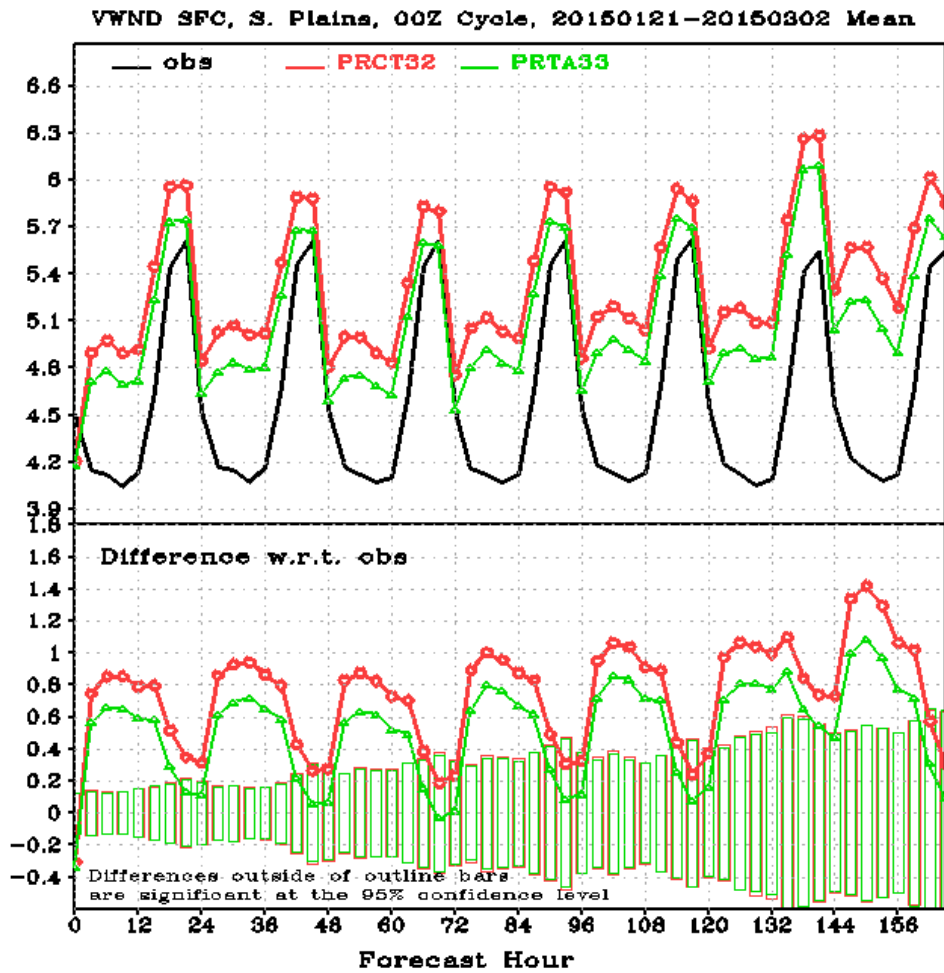
CONUS East



Reduced wet bias and RMSE afternoon and nighttime (~ 0.35 °C)

Surface wind speed and its RMSE

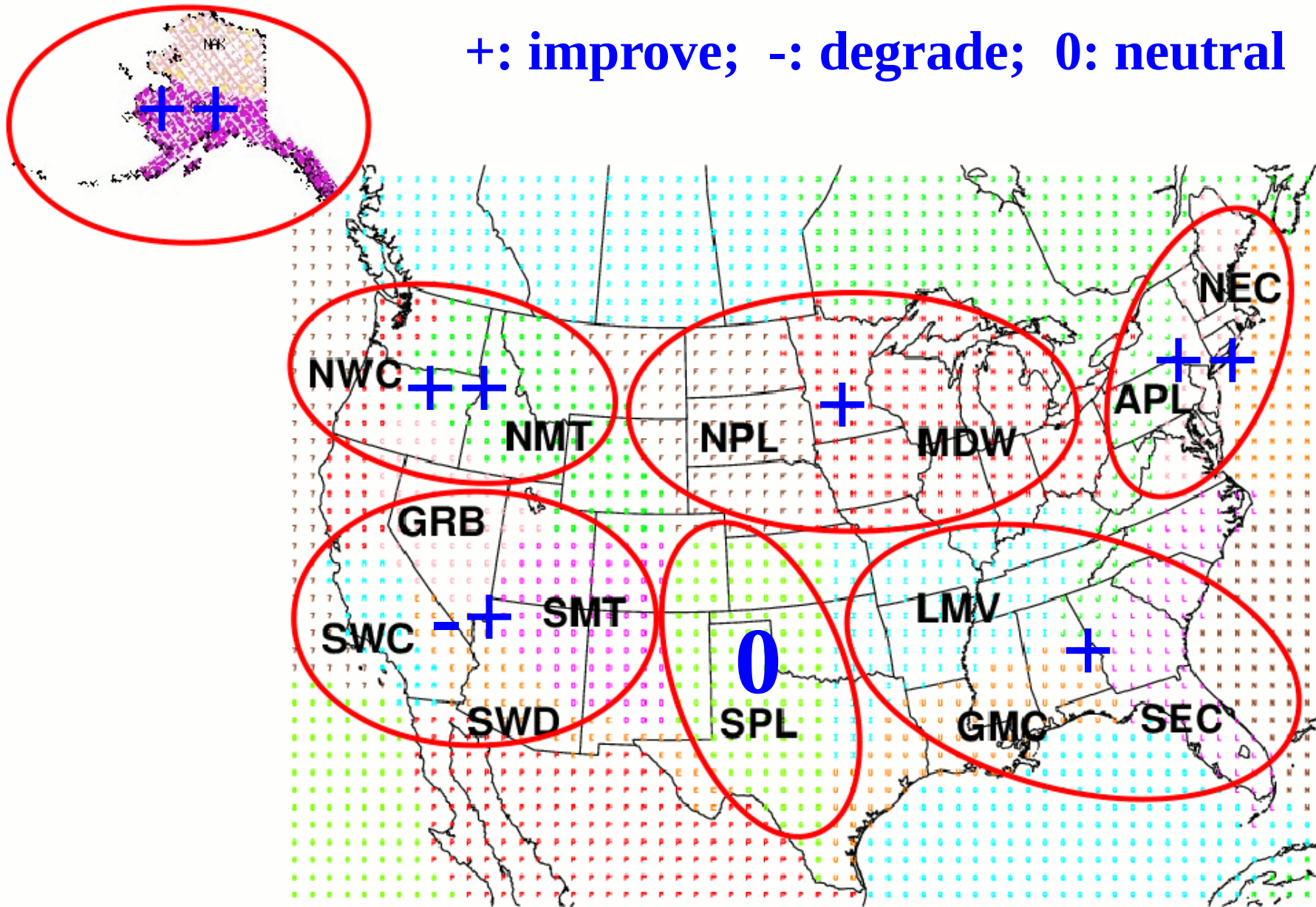
South Plains



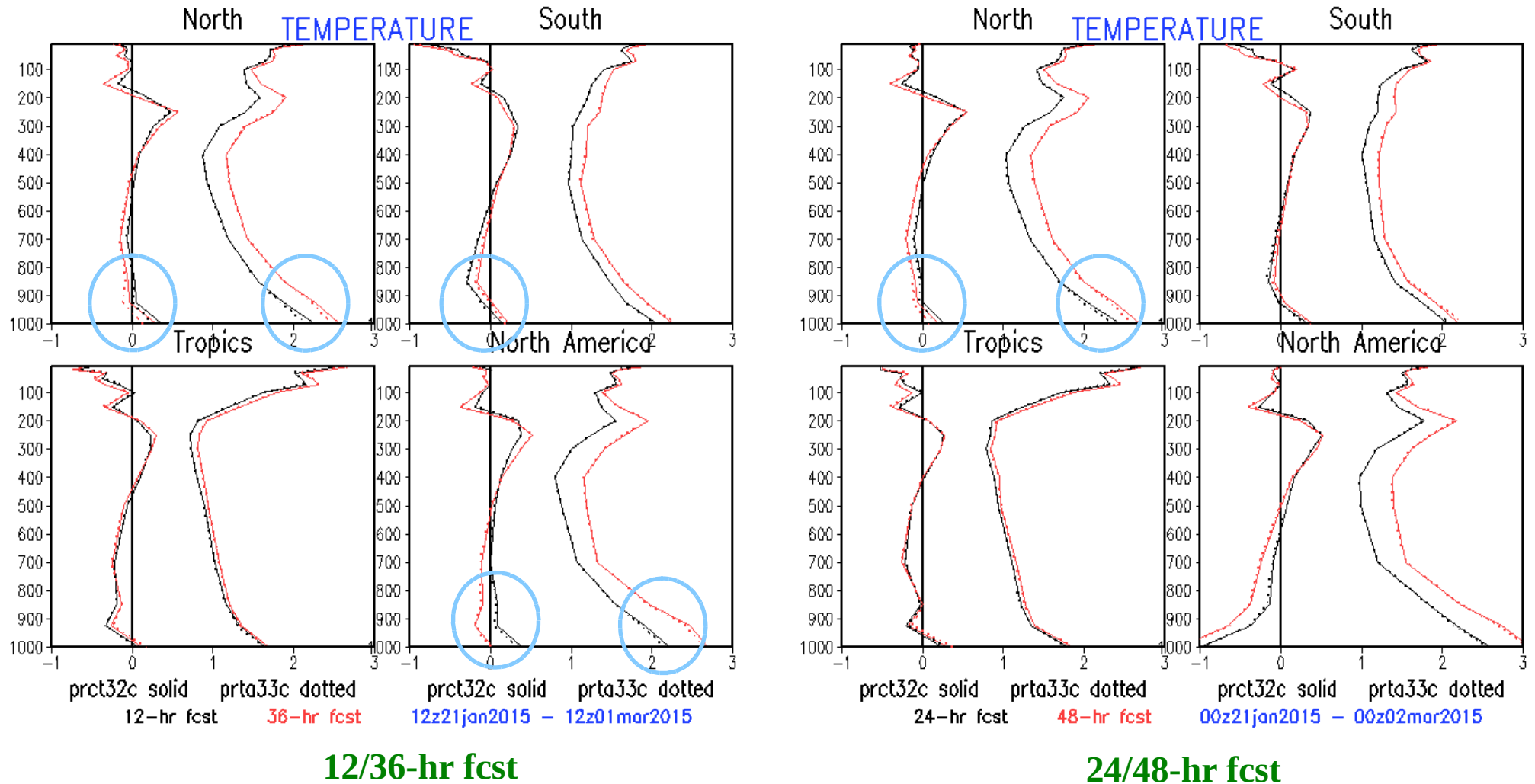
Reduced high wind speed bias and RMSE daytime and nighttime.

Forecast Verification Statistics (FVS) regions (Win)

+: improve; -: degrade; 0: neutral

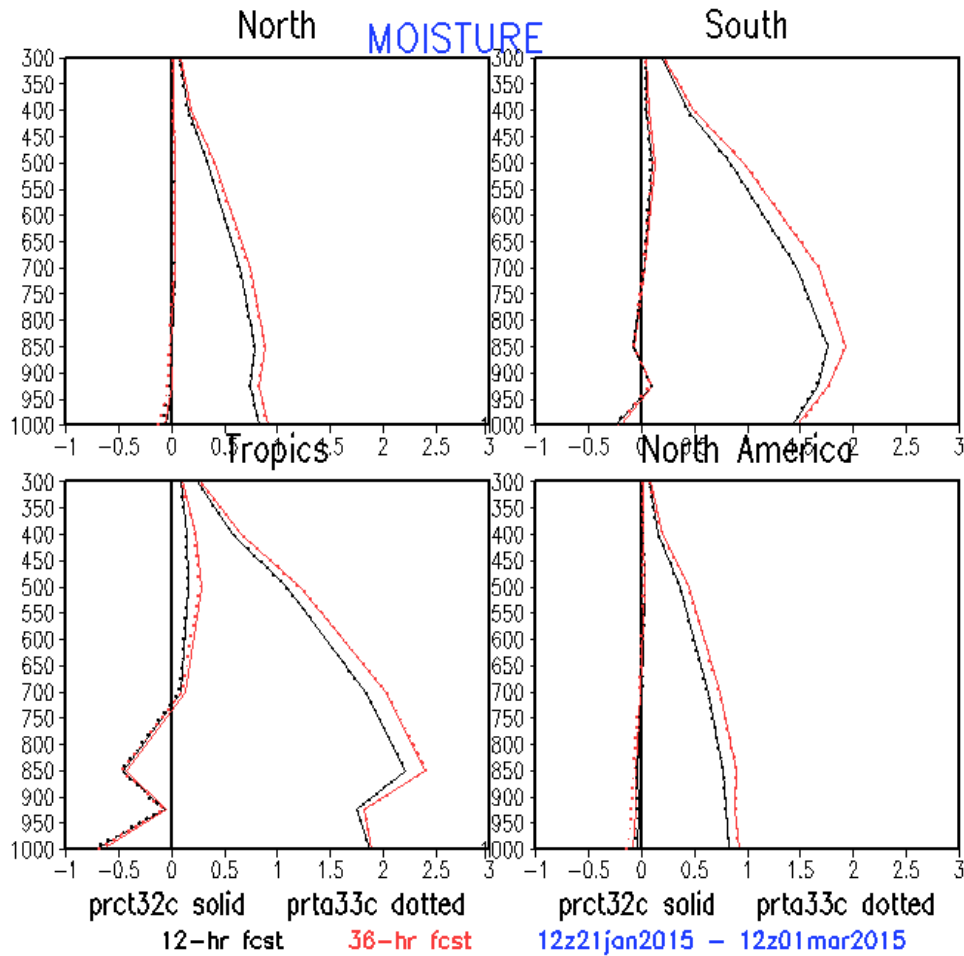


Winter: Temperature fits to Obs: Bias and RMSE

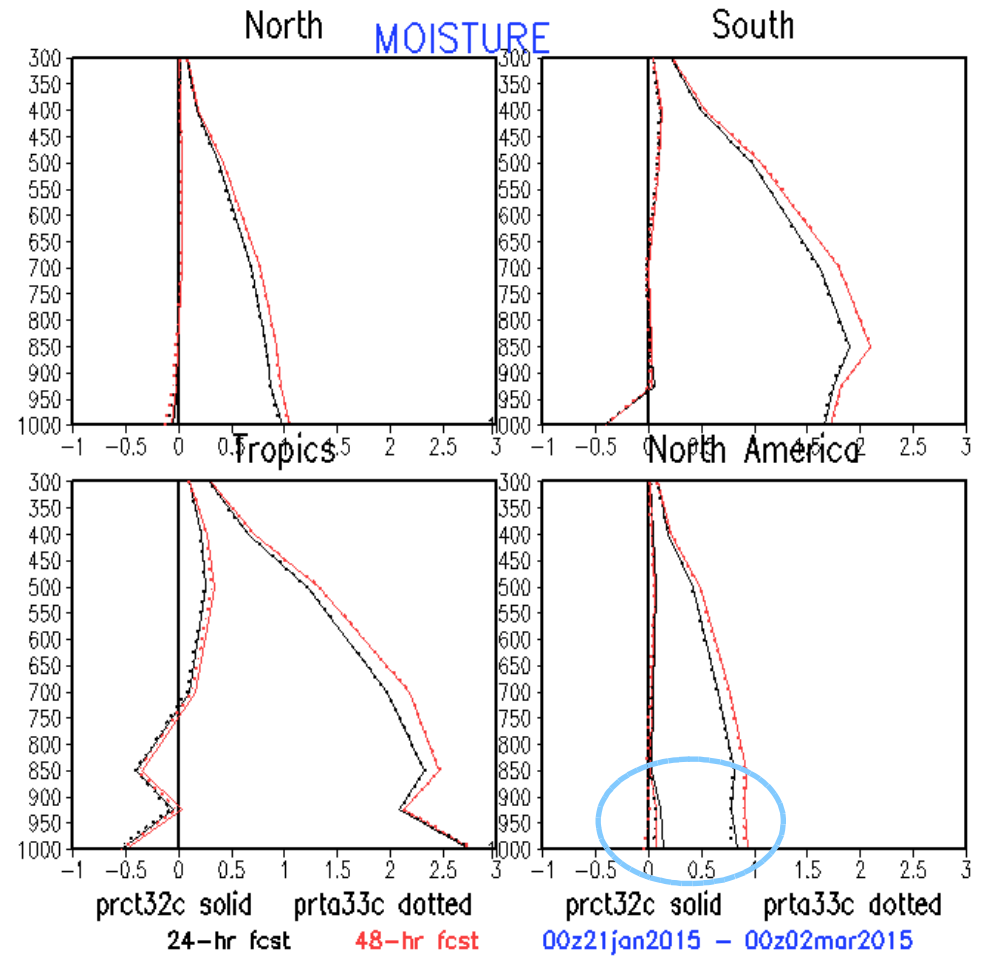


Reduced temperature bias and RMSE near the surface

Winter: Moisture fits to Obs: Bias and RMSE



12/36-hr fcst

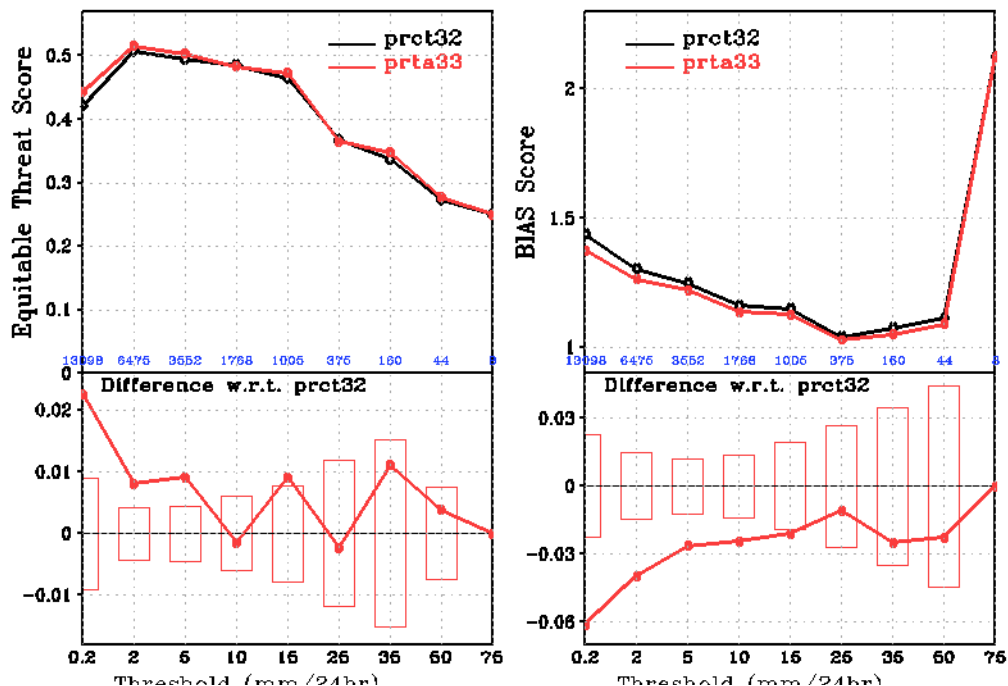


24/48-hr fcst

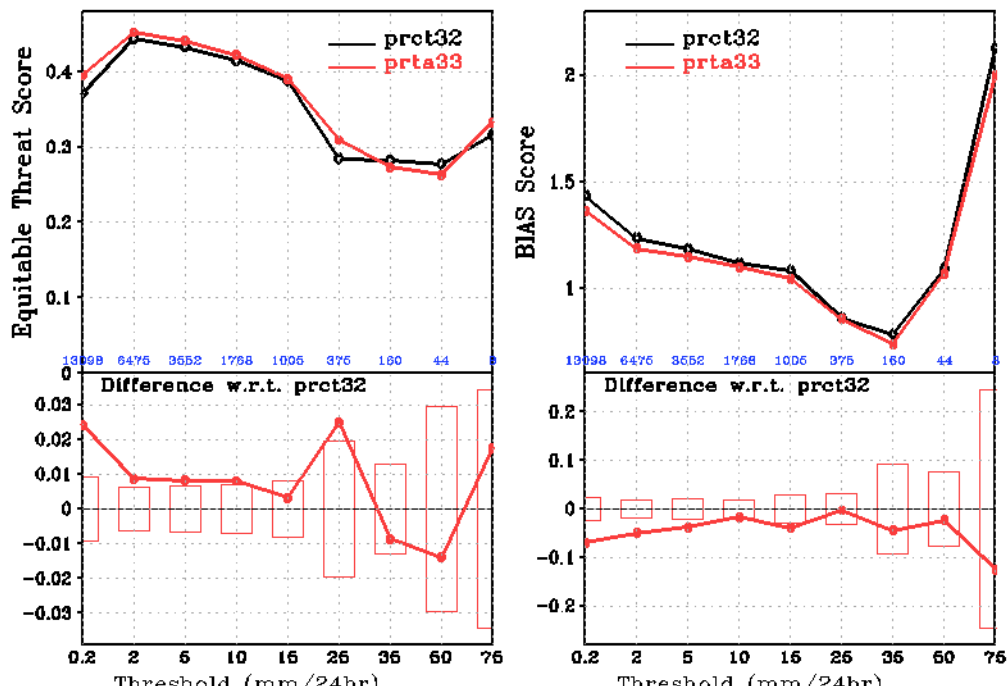
Reduced moisture bias and RMSE near the surface in North America

Precipitation Skill Scores over CONUS: f12-f36, f36-f60, f60-f84

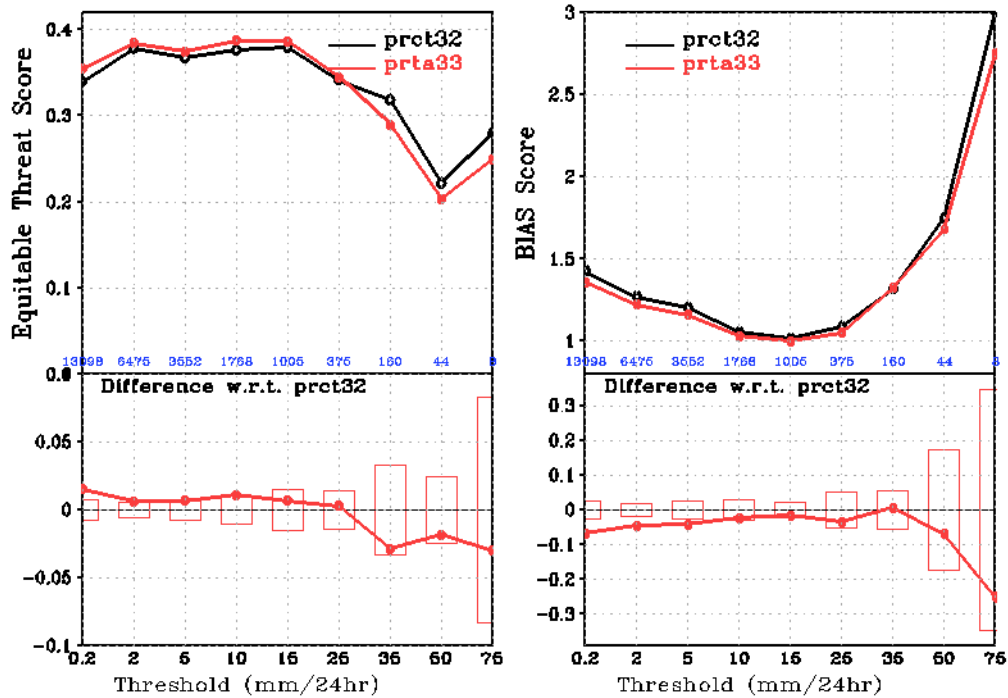
CONUS Precip Skill Scores, f12-f36, 21Jan2015-02mar2015 00Z Cycle



CONUS Precip Skill Scores, f36-f60, 21Jan2015-02mar2015 00Z Cycle



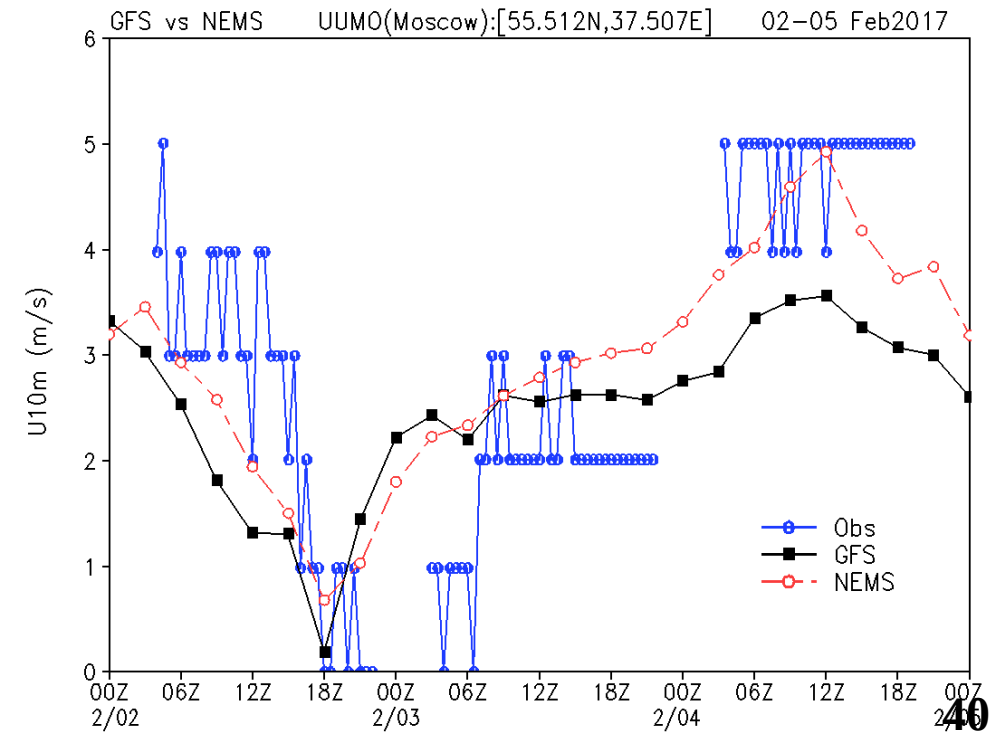
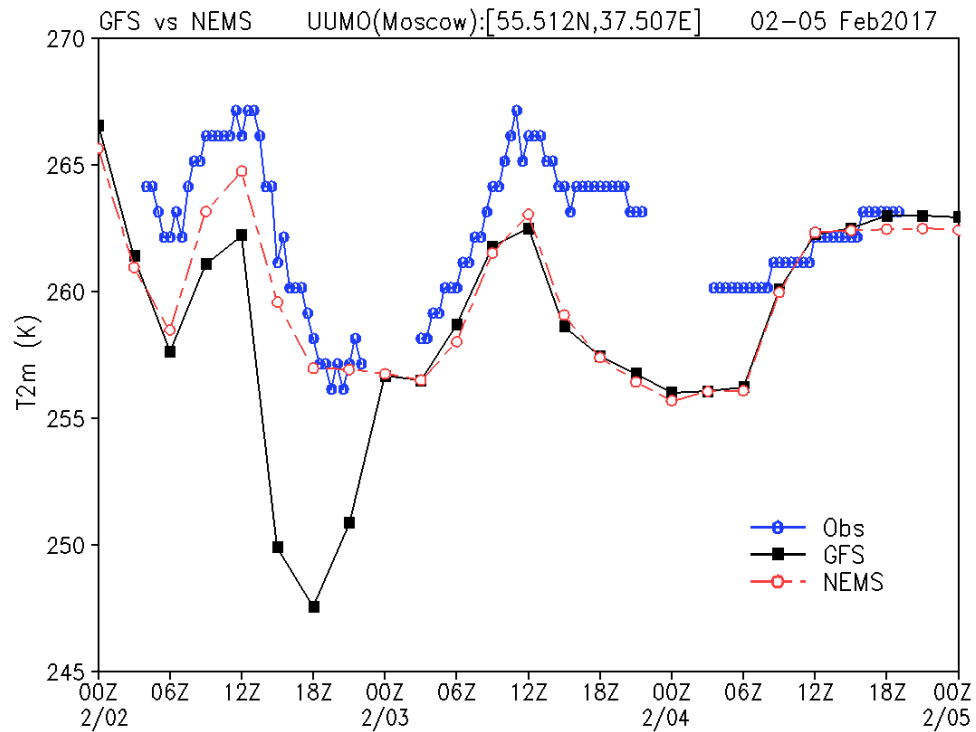
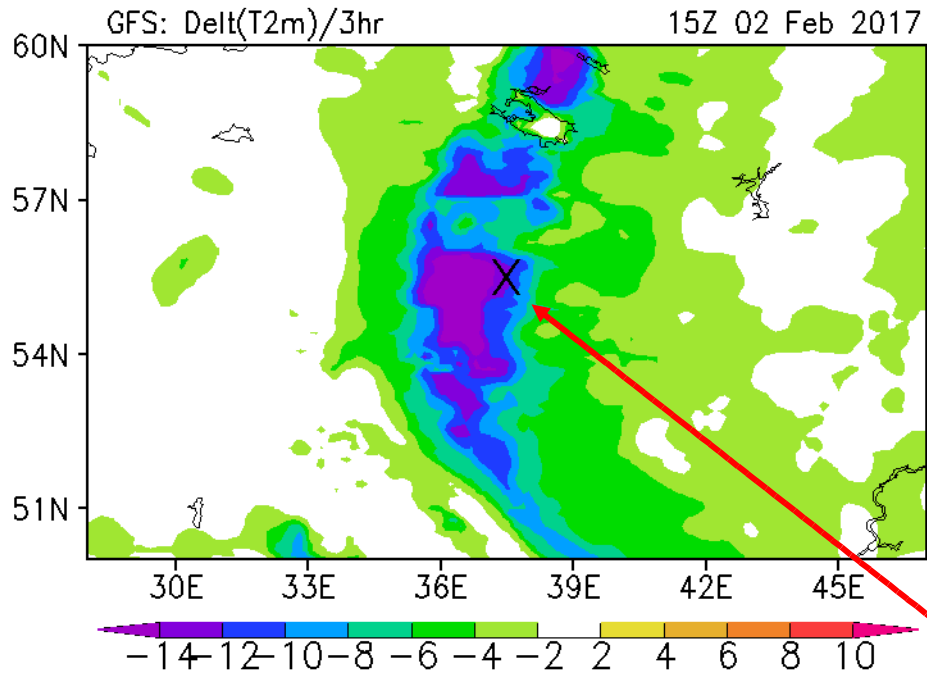
CONUS Precip Skill Scores, f60-f84, 21Jan2015-02mar2015 00Z Cycle



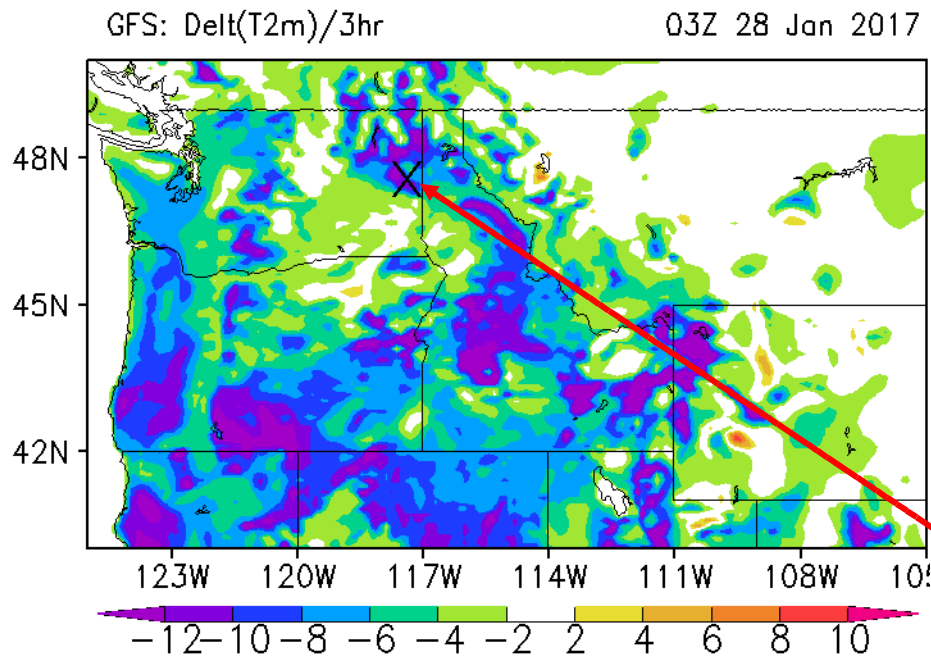
Differences outside of the hollow bars are 95% significant based on 10000 Monte Carlo Tests

Improved scores for light and medium precipitation and reduced their bias.

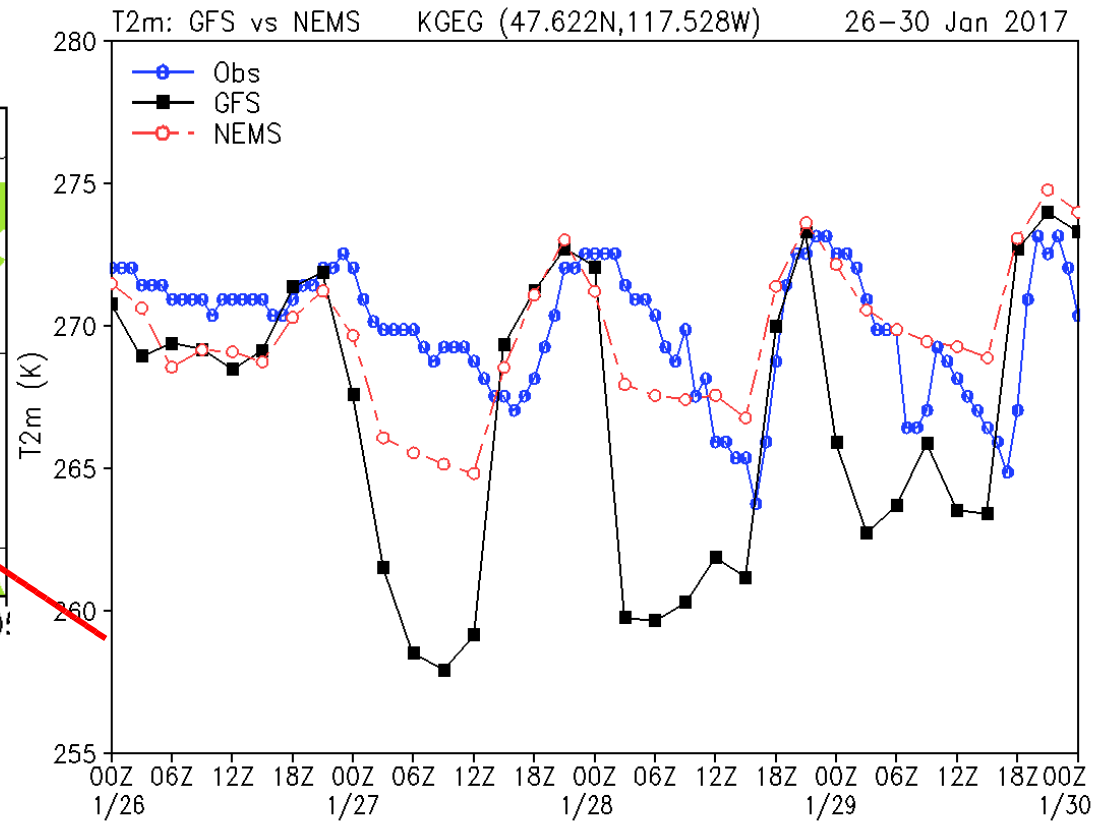
NEMS Case: GFS/NEMS T2m @ UUMO Moscow, Russia



NEMS Case: GFS/NEMS T2m @ GEG Spokane Airport, WA



GFS: T2m forecast > 12 C temperature drop in 3 hours.



**GFS: Rapidly cooling more than 12 °C during 3hr;
NEMS: Substantially improved around sunset.**

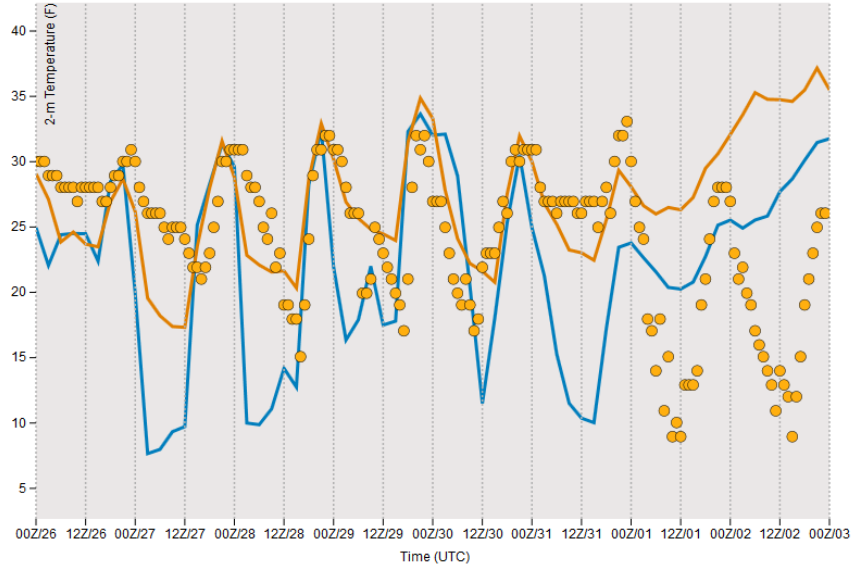
NEMS Case: GFS/NEMS T2m @ GEG Spokane Airport, WA

EMC GFSX plumes

<http://www.emc.ncep.noaa.gov/mmb/cguastini/gfsx/EMCGFSXplum...>

00Z 01/26/2017 Cycle: 1/26 – 2/1

EMC's GFSX plumes for: KEGG
00 UTC 26 January 2017 cycle



Courtesy Glenn white for the obs.

y min y max Set y axis Reset y axis
T2m: GFS vs NEMS

About the plumes: Data for each station is interpolated from a 0.5-degree grid for both the GFS (blue) and GFSX (orange). All observed data are derived from hourly station reports. Zoom for more CONUS stations.

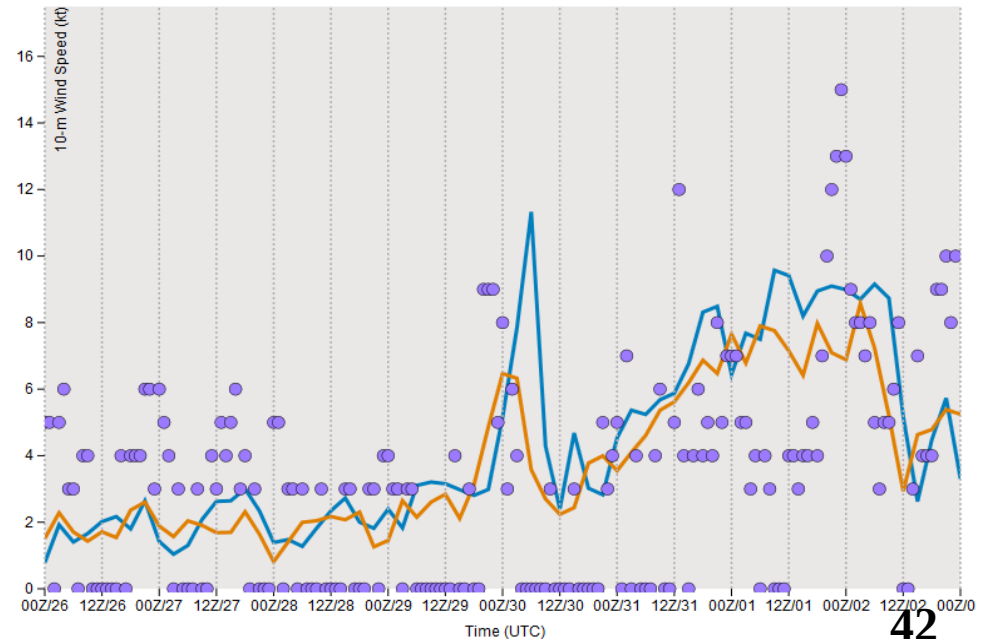
This site is not operational; therefore, data will be missing occasionally. The contact for this site is corey.guastini@noaa.gov

Courtesy Corey Guastini & Tracey Dorian for the plume diagrams

wspd@10m: GFS vs NEMS

Weak wind: 1/26 – 1/29

EMC's GFSX plumes for: KEGG
00 UTC 26 January 2017 cycle



Summary/Discussion

- **The GFS T2m excessive cold bias is closely related to the positive/negative feedback between the land and the atmosphere under stable conditions.**
- **The modifications were proposed to fix the T2m cold bias, which prevented the coupling system from decoupling.**
- **The case study for snow-free or snow pack indicates the modifications can remove the excessive cold biases of T2m and Tskin, and temperature at the first model level was also improved.**
- **The tests for the medium range GFS free forecasts demonstrate the modifications can substantially reduce the T2m cold bias in the late afternoon and nighttime, except for the Southwest region where the sensitivity tests show a little warm bias during nighttime but again reduce RMSE.**
- **We plan to include these modifications in next upgrade operational NEMS GFS model in 2017.**
- **In the future, new land data sets (e.g. veg/soil types, new GVF, albedo, etc.) will be updated in the model and expect to further reduction of T2m bias.**

Thank You !

Any questions/comments?