

Adding Four-Dimensional Data Assimilation (a.k.a. grid nudging) to MPAS

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Acknowledgements

- Rob Gilliam (EPA) – Atmospheric Model Evaluation Tool (AMET), used for evaluation of modeling results against observations in NCEP's Meteorological Assimilation Data Ingest System (MADIS)
- Hosein Foroutan (NRC Post Doc at EPA) – Provided code for mass balance checking in MPAS-Atmosphere

Introduction

- The U.S. Environmental Protection Agency is considering the Model for Prediction Across Scales (MPAS) as the basis for its “next-generation” air-quality modeling system.
- MM4, MM5, and WRF have previously been used to provide meteorological information for the Community Multi-scale Air Quality (CMAQ) model.
- Nearly all of our applications are done in a retrospective mode where the simulation can be “nudged” towards known past conditions using Four-Dimensional Data Assimilation (FDDA).
- Data assimilation methods using 4D-VAR/EnKF tend to be much more computationally expensive.

FDDA in MPAS - Atmosphere

- The concept of “analysis nudging” from Stauffer and Seaman (1990) has been applied in MPAS-Atmosphere just as it was to MM4, MM5 and WRF.
- MPAS has no rectangular grid like WRF. However, once the necessary “target” values are define to match the MPAS prognostic variable array, the nudging process is much the same.
- One FDDA option that WRF does have that we cannot apply in MPAS is “spectral nudging” where finer-scale model features are selectively conserved.
- To provide a similar capability for MPAS when Voronoi mesh refinement is applied, the nudging strength can be reduced for smaller cells. Stauffer and Seaman (1994) recommended weaker nudging for fine-scale modeling.

FDDA in the MPAS code structure

- Working from MPAS version 4.0 (code dated 22 May 2015)
- Special FORTRAN modules for FDDA are all contained in ~/src/core_atmosphere/physics
- Modified:
 - mpas_atmphys_driver.F
 - mpas_atmphys_manager.F
 - mpas_atmphys_todynamics.F
- New:
 - mpas_atmphys_fdda.F
- ~/src/core_atmosphere/registry.xml is modified for new arrays and to add the FDDA input stream
- ~/src/core_atmosphere/physics/Makefile is augmented to build with the new FDDA module

Creating the FDDA Targets

- FDDA nudging is applied for temperature (Θ), humidity (q_v) and wind (U). Wind involves some extra complications.
- MPAS system already provides model initialization software
- Simply apply that software for each time where FDDA targets are desired. (typically 00, 06, 12, 18 UTC)
- Scripts have been developed to automate the process of running `init_atmosphere_model` for each FDDA time, extracting the nudged prognostic variables, and composing the FDDA input file.
- Variable extraction and FDDA file composition is done using NetCDF Operators (NCO) software.

FDDA Tendencies

- Prognostic variables for temperature, water vapor and wind are “nudged” towards target values which represent the best estimate for actual values.
- The nudging tendency for prognostic variable α is obtained from:

$$(\partial\alpha/\partial t)_{FDDA} = G_{\alpha} W_{layer} W_{PBL} (\alpha_{target} - \alpha)$$

where: G_{α} is a nudging inverse time scale or “nudging coefficient”

W_{layer} is a layer-dependent weighting function (1 or 0)

W_{PBL} is a PBL weighting function (1 or 0)

- $W_{layer} = 1$ in layers \geq a namelist-specified layer number,
= 0 otherwise
- $W_{PBL} = 1$ in layers above the PBL height ($k > k_{pbl}$),
= 1 if namelist control variable is set to .true.,
= 0 otherwise

FDDA Tendencies

- Nudging of Θ and q_v is from direct comparison of model and target values at cell centers.
- *U*-nudging is based on FDDA tendencies for variables *UReconstructZonal* and *UReconstructMeridional* at cell centers.
 - PBL and convection schemes already operate on wind components at cell centers and use subroutine “tend_toEdges”
 - Could nudge wind across cell edges (*U*), but this presents 1.5 times as many values to nudge and would require complex logic separate from Θ and q_v nudging
 - Would also make future addition of obs-nudging more difficult
- Coupled tendencies for Θ , q_v and *U* are calculated with the new FDDA terms in “physics/mpas_atmphys_todynamics.F”

FDDA Namelist Options

- Additional physics options

config_fdda_scheme = 'off' (default)
 = 'no_scaling'
 = 'length_scaled'

- With 'no_scaling', the nudging coefficient is always applied at the value specified for each variable
- With 'length_scaled', the nudging coefficient is scaled down for cells with mean distance to its neighboring cells ($dcEdge_m$) < 100000 m. Scaling factor for cell (k) is $dcEdge_m(k)/100000$.
- I'm just now starting to test model sensitivity to other scaling functions and thresholds.

FDDA Namelist Options

- Additional physics options

`config_fdda_t = .true. or .false. (default is .false.)`

`config_fdda_t_in_pbl = .true. or .false. (default is .true.)`

`config_fdda_t_min_layer = INTEGER (default is 0)`

`config_fdda_t_coef = REAL (default is 3.0E-4.)`

`config_fdda_q = .true. or .false. (default is .false.)`

`config_fdda_q_in_pbl = .true. or .false. (default is .true.)`

`config_fdda_q_min_layer = INTEGER (default is 0)`

`config_fdda_q_coef = REAL (default is 3.0E-4) [may reduce this]`

`config_fdda_uv = .true. or .false. (default is .false.)`

`config_fdda_uv_in_pbl = .true. or .false. (default is .true.)`

`config_fdda_uv_min_layer = INTEGER (default is 0)`

`config_fdda_uv_coef = REAL (default is 3.0E-4)`

FDDA Test Application

- MPAS-Atmosphere was applied on the published 92-25km mesh (x4.163842.grid.nc) with the origin repositioned to 40N, 95W
- Model initialization and FDDA data were produced from 1 x 1° NCEP FNL Operational Model Global Tropospheric Analyses (ds083.2)
- USGS land use data were used here (now testing with MODIS)
- Model top: 30 km W-damping height: 27 km
- Model layers: 50 (custom vertical distribution)
- Simulation period: 00 UTC 1 July 2013 – 00 UTC 1 August 2013
- Time step length: 150 s Number of acoustic sub-steps: 6
- Horizontal diffusion length: 25 km
- Other non-physics options: default

FDDA Test Application

- Physics options for standard MPAS

`config_sst_update = .true. and .false.` (*tested using both options*)

`config_sstdiurn_update = .false.`

`config_deepsoiltemp_update = .false.`

`config_radt_lw_scheme = 'rrtmg_lw'`

`config_radt_sw_scheme = 'rrtmg_sw'`

`config_radtlw_interval = '00:10:00'`

`config_radtsw_interval = '00:10:00'`

`config_bucket_update = 'none'`

`config_microp_scheme = 'wsm6'`

`config_convection_scheme = 'kain_fritsch'`

`config_lsm_scheme = 'noah'`

`config_pbl_scheme = 'ysu'`

`config_gwdo_scheme = 'off'`

`config_radt_cld_scheme = 'cld_fraction'`

`config_sfclayer_scheme = 'monin_obukhov'`

FDDA Test Application

- Physics options for FDDA

`config_fdda_scheme = 'off', 'no_scaling' and 'length_scaled'`

`config_fdda_t = .true.`

`config_fdda_t_in_pbl = .false.`

`config_fdda_t_min_layer = 0`

`config_fdda_t_coef = 3.0E-4.`

`config_fdda_q = .true.`

`config_fdda_q_in_pbl = .false.`

`config_fdda_q_min_layer = 0`

`config_fdda_q_coef = 3.0E-5`

`config_fdda_uv = .true.`

`config_fdda_uv_in_pbl = .false.`

`config_fdda_uv_min_layer = 0`

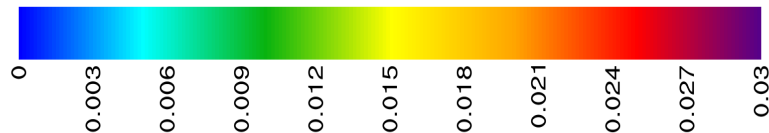
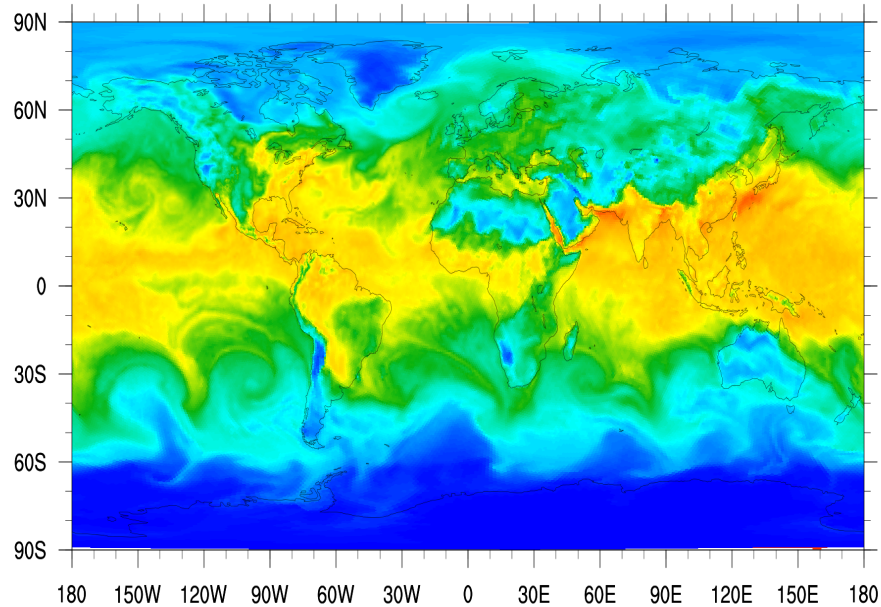
`config_fdda_uv_coef = 3.0E-4`

Without FDDA

FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

/work/MOD3DEV/bro/mpas_fdda/92-25km/July_2013/x4.163842.US_fdda.nc

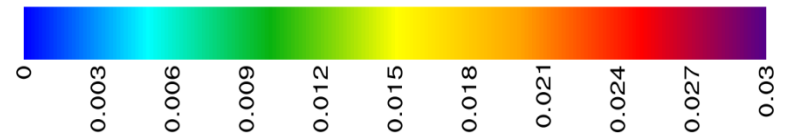
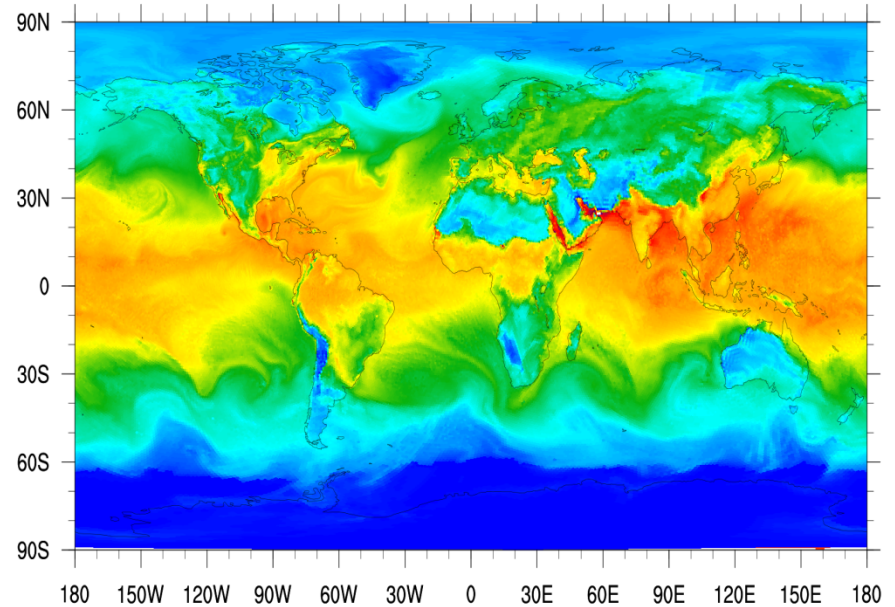


Layer 1

Simulation (+5 days)

Water Vapor Mixing Ratio (g/g)

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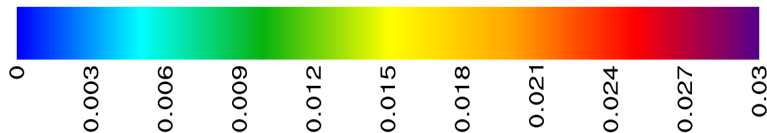
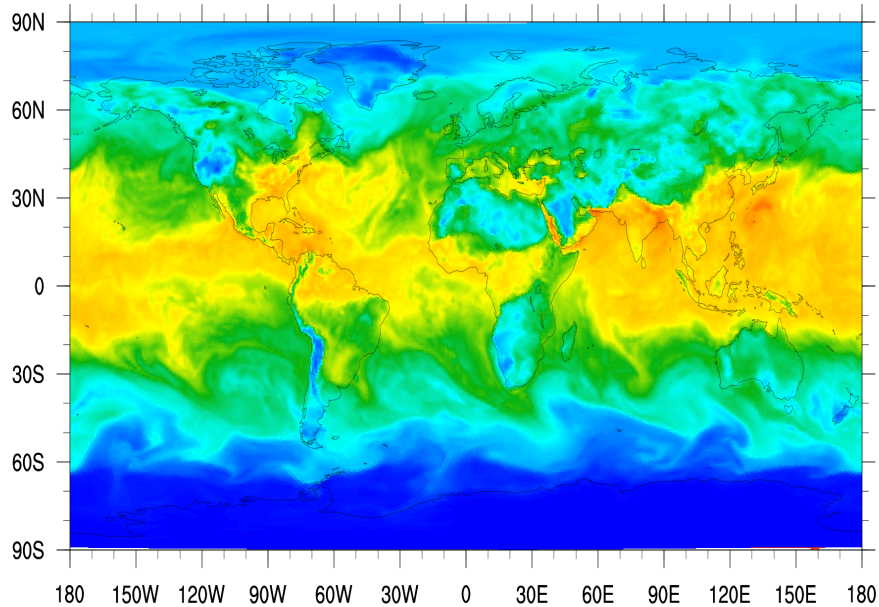
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Without FDDA

FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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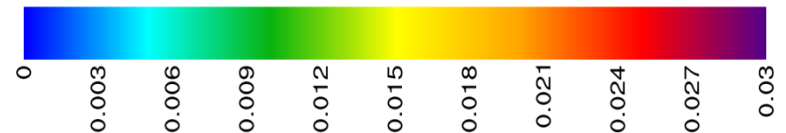
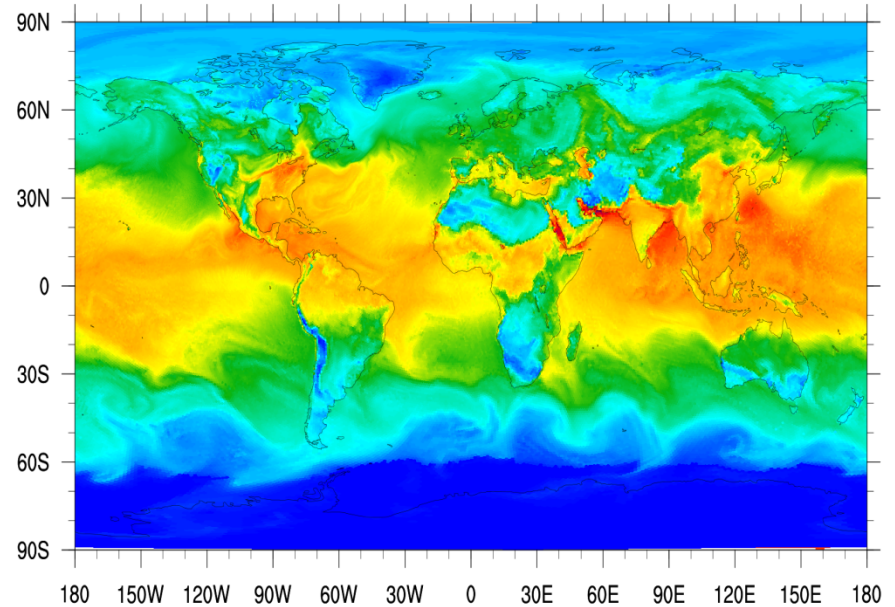


Layer 1

Simulation (+10 days)

Water Vapor Mixing Ratio (g/g)

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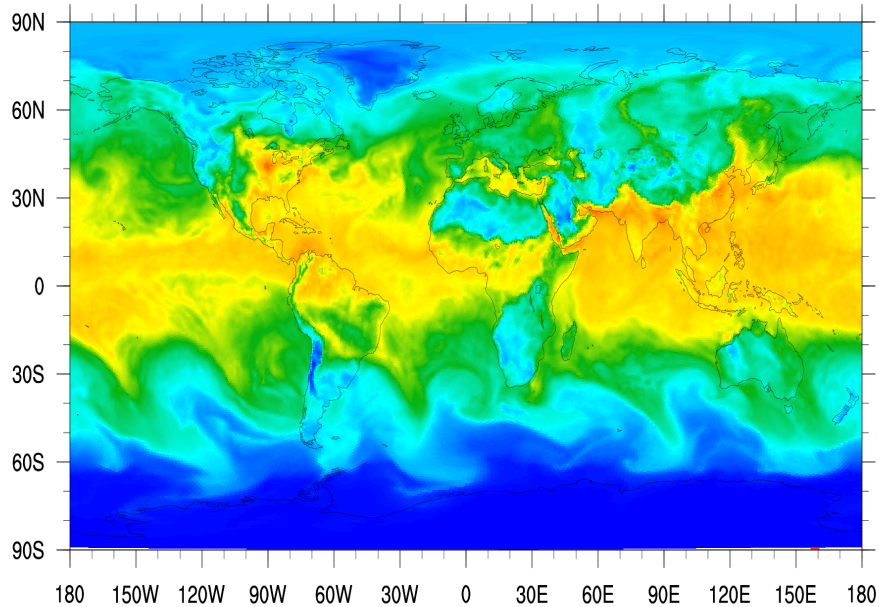
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Without FDDA

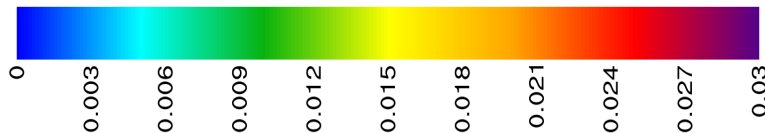
FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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2013-07-16_00:00:00

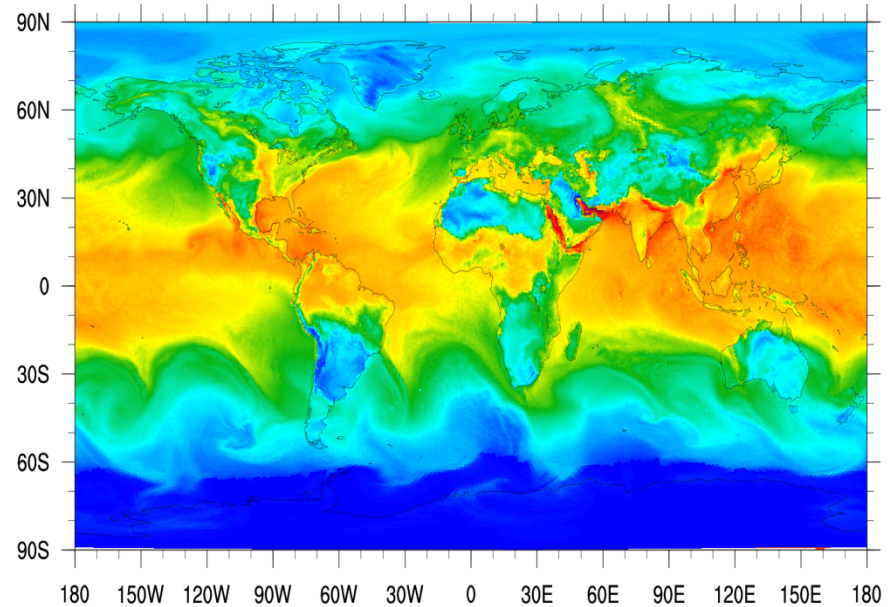


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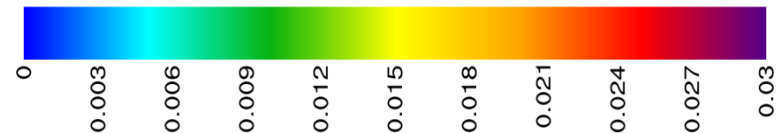
Simulation (+15 days)

Water Vapor Mixing Ratio (g/g)

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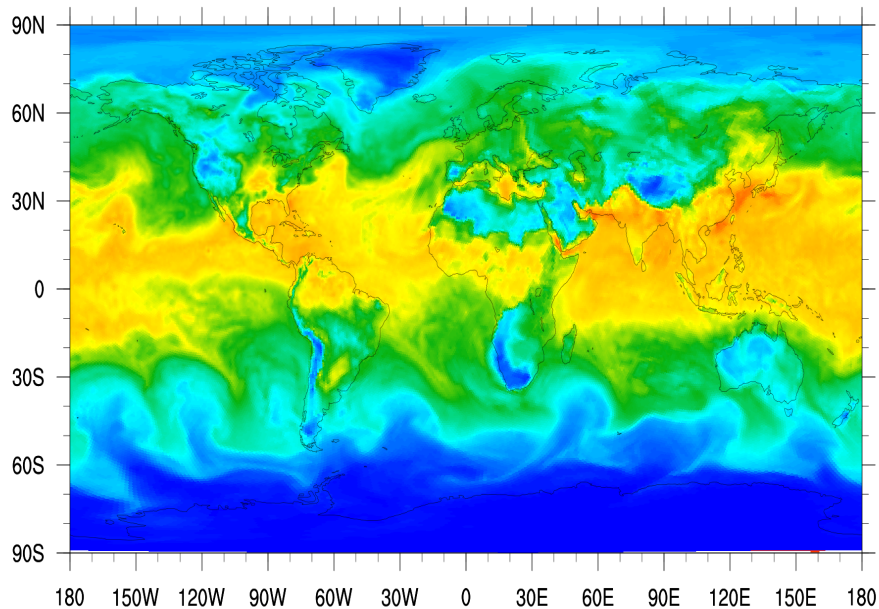
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Without FDDA

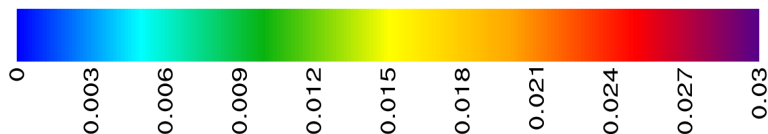
FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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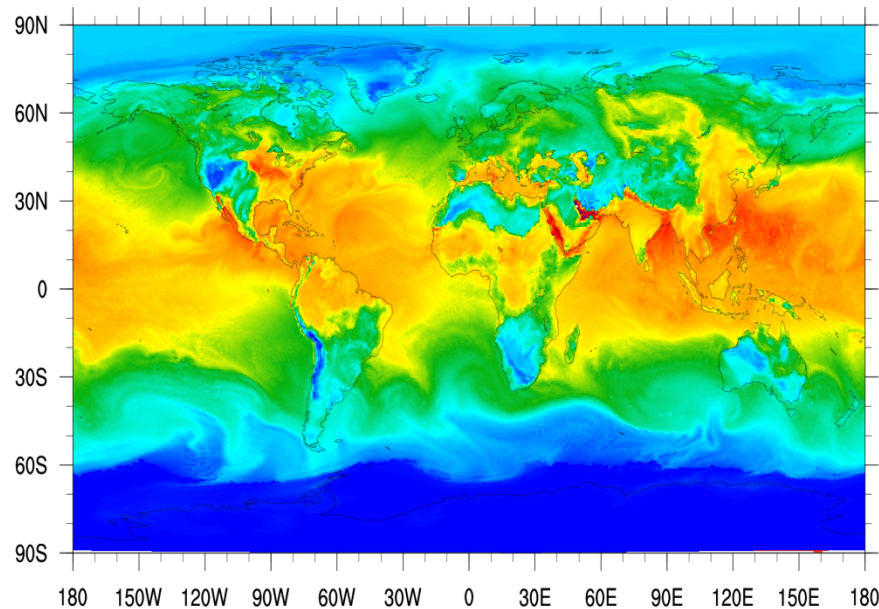


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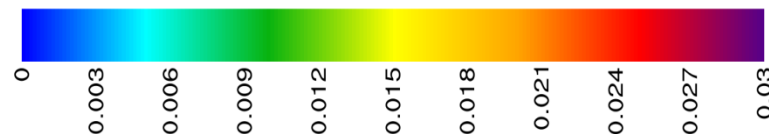
Simulation (+30 days)

Water Vapor Mixing Ratio (g/g)

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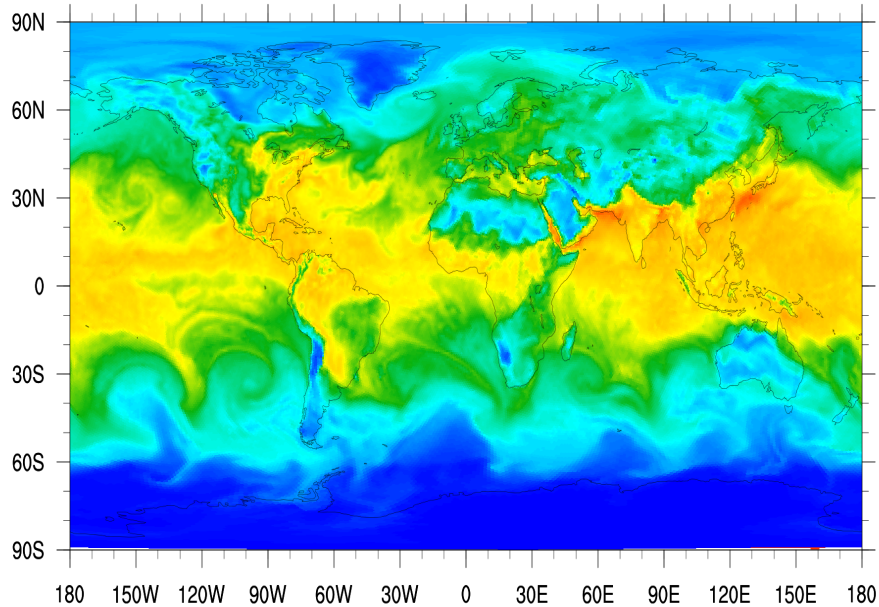
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With FDDA

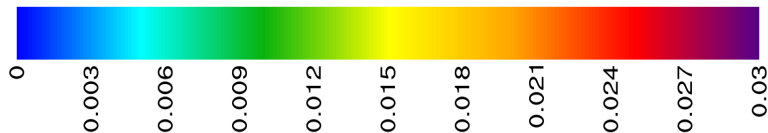
FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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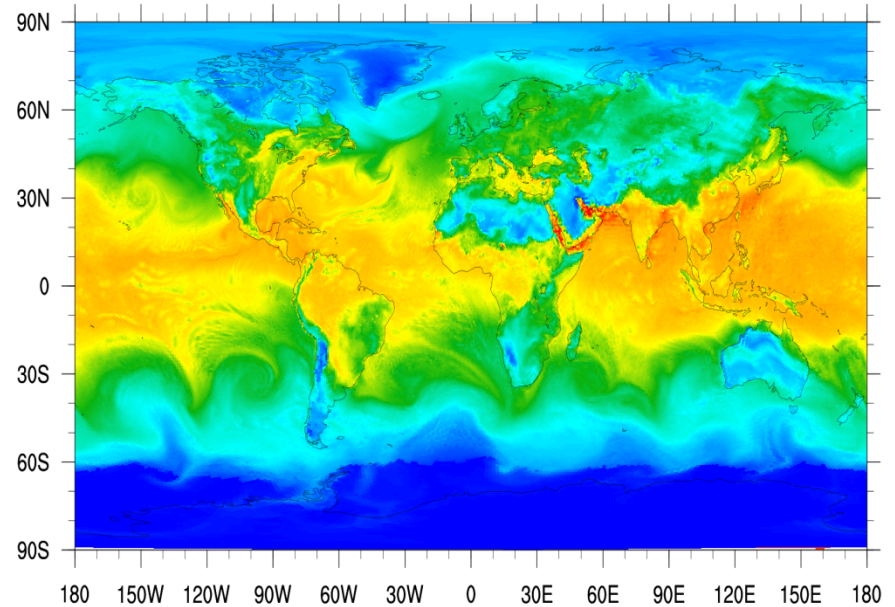


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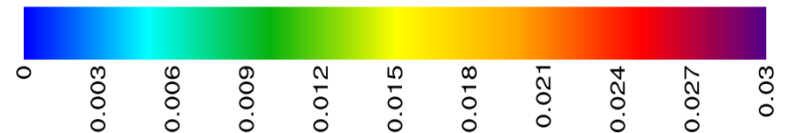
Simulation (+5 days)

Water Vapor Mixing Ratio (g/g)

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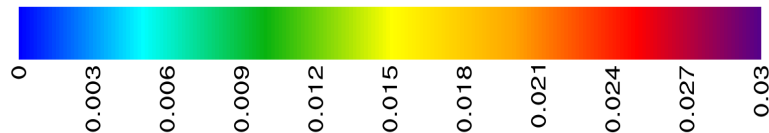
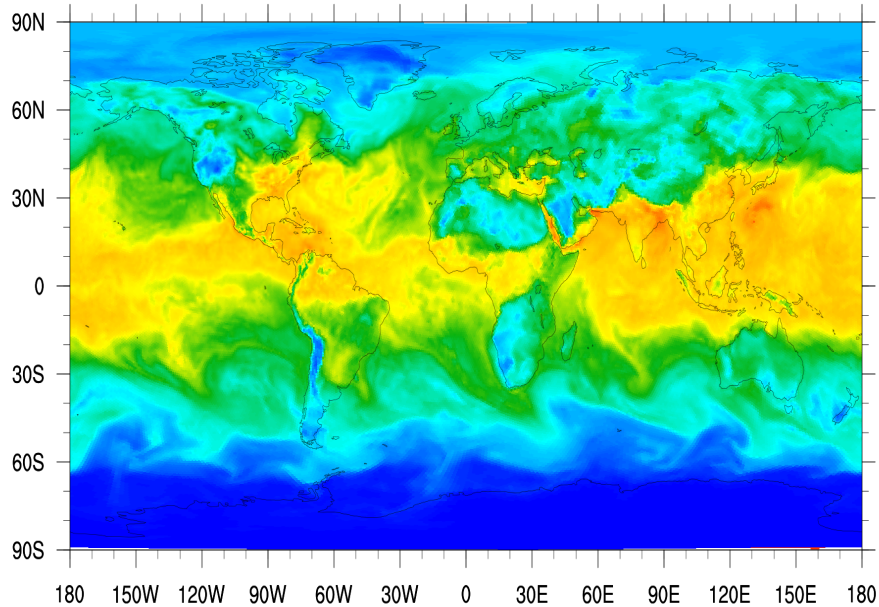
Layer 1

With FDDA

FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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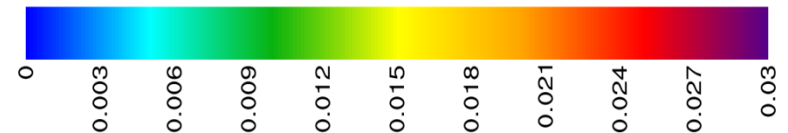
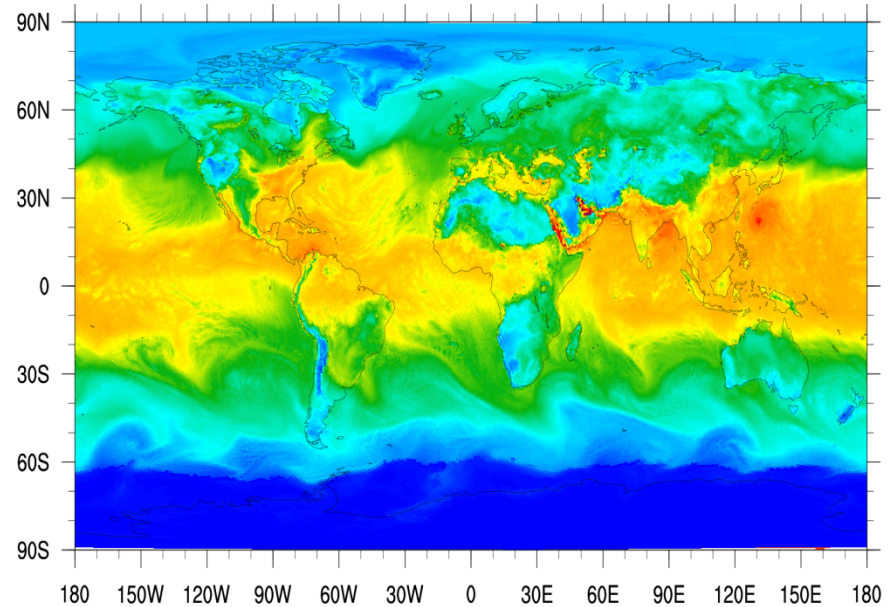


Layer 1

Simulation (+10 days)

Water Vapor Mixing Ratio (g/g)

/work/MOD3DEV/bro/mpas_output/92-25km/July_2013_FDDA_scaled_sfcinpu/history.2013-07-11.nc



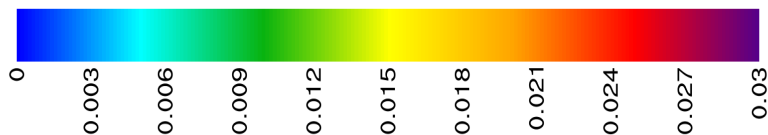
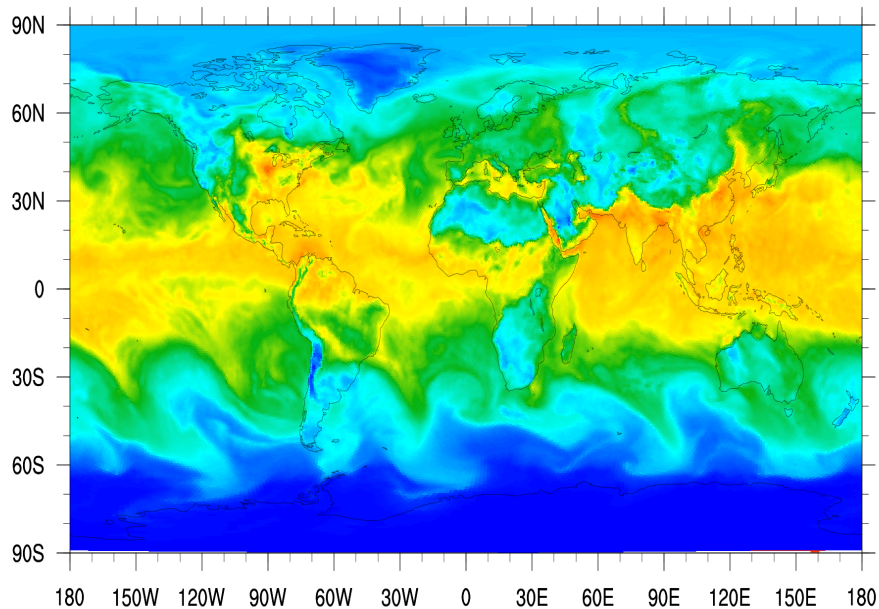
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With FDDA

FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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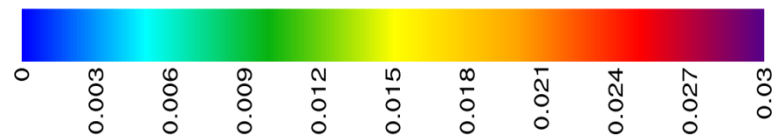
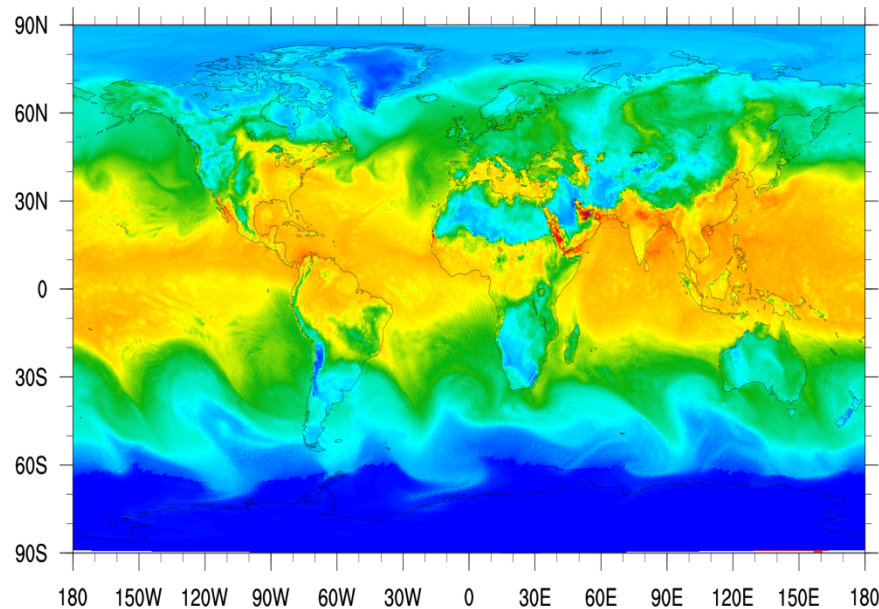


Layer 1

Simulation (+15 days)

Water Vapor Mixing Ratio (g/g)

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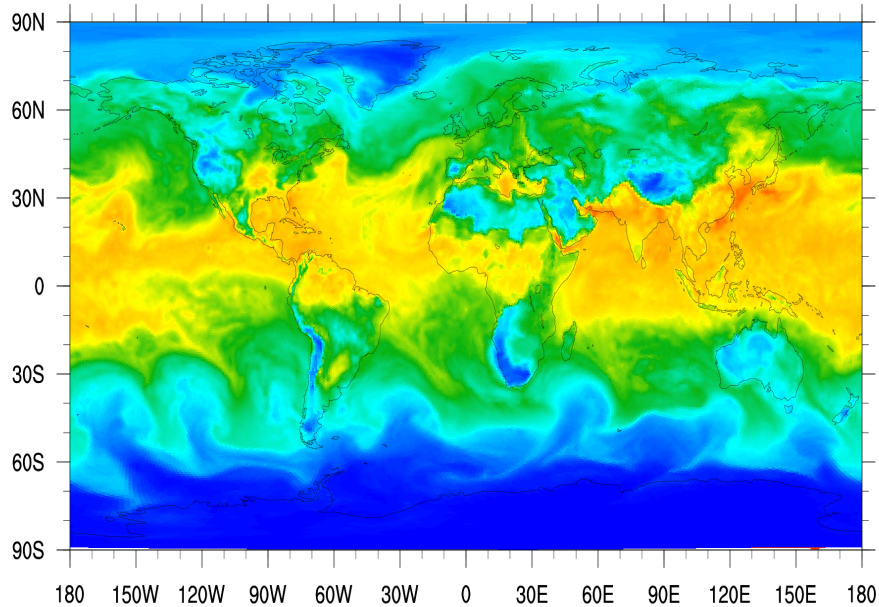
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With FDDA

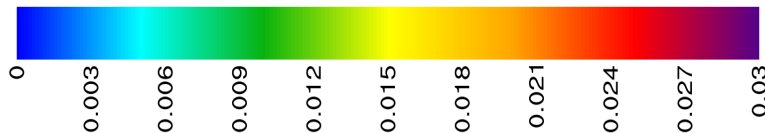
FDDA Target (FNL)

Water Vapor Mixing Ratio (g/g)

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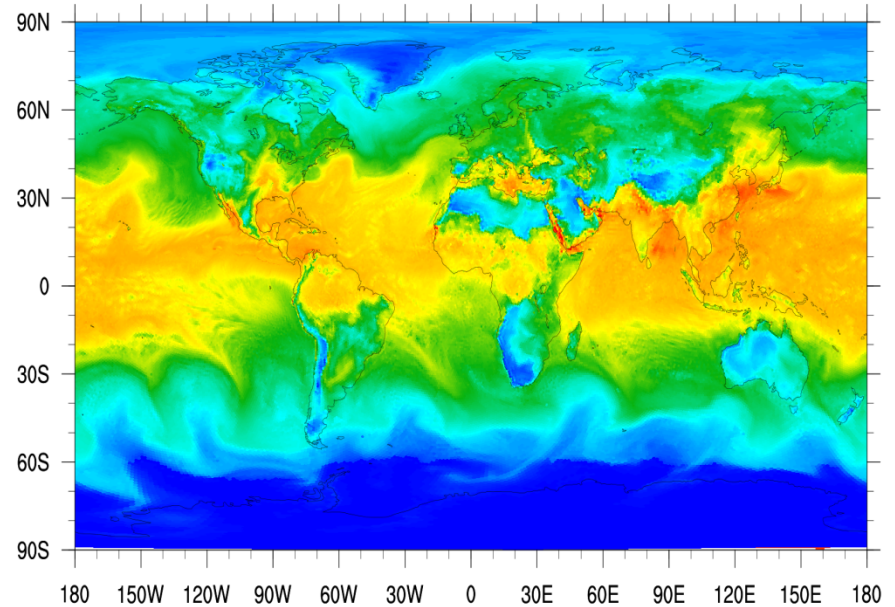


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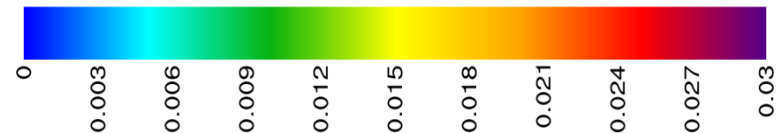
Simulation (+30 days)

Water Vapor Mixing Ratio (g/g)

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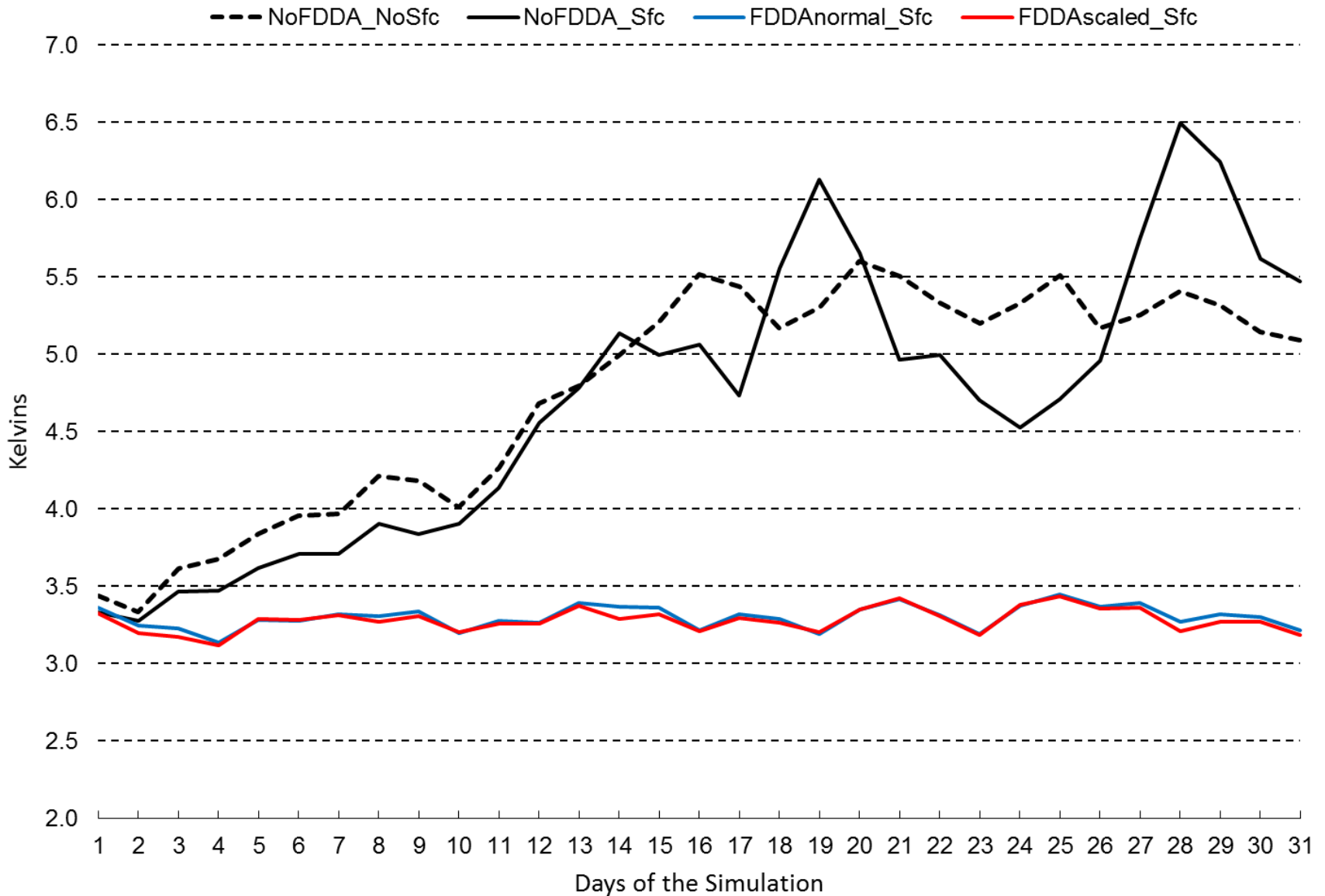


Layer 1

But now let's see how the test runs compare to observations

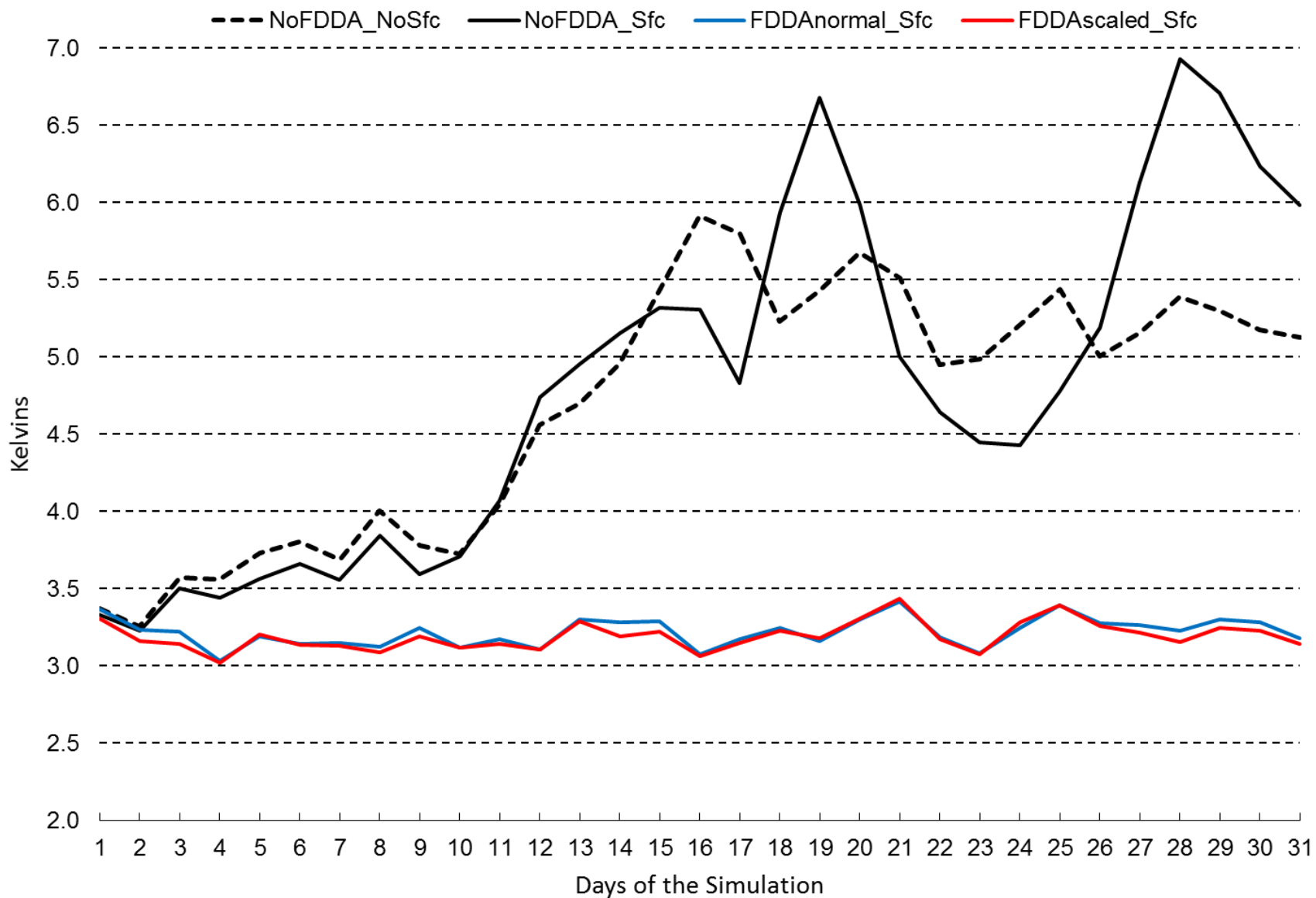
- ***AMET used to evaluate MPAS results
against surface observations in MADIS***
- ***~4000 observations per hour***
- ***Daily averaged statistics***

Full Global Domain 2-m Temperature - RMS Error



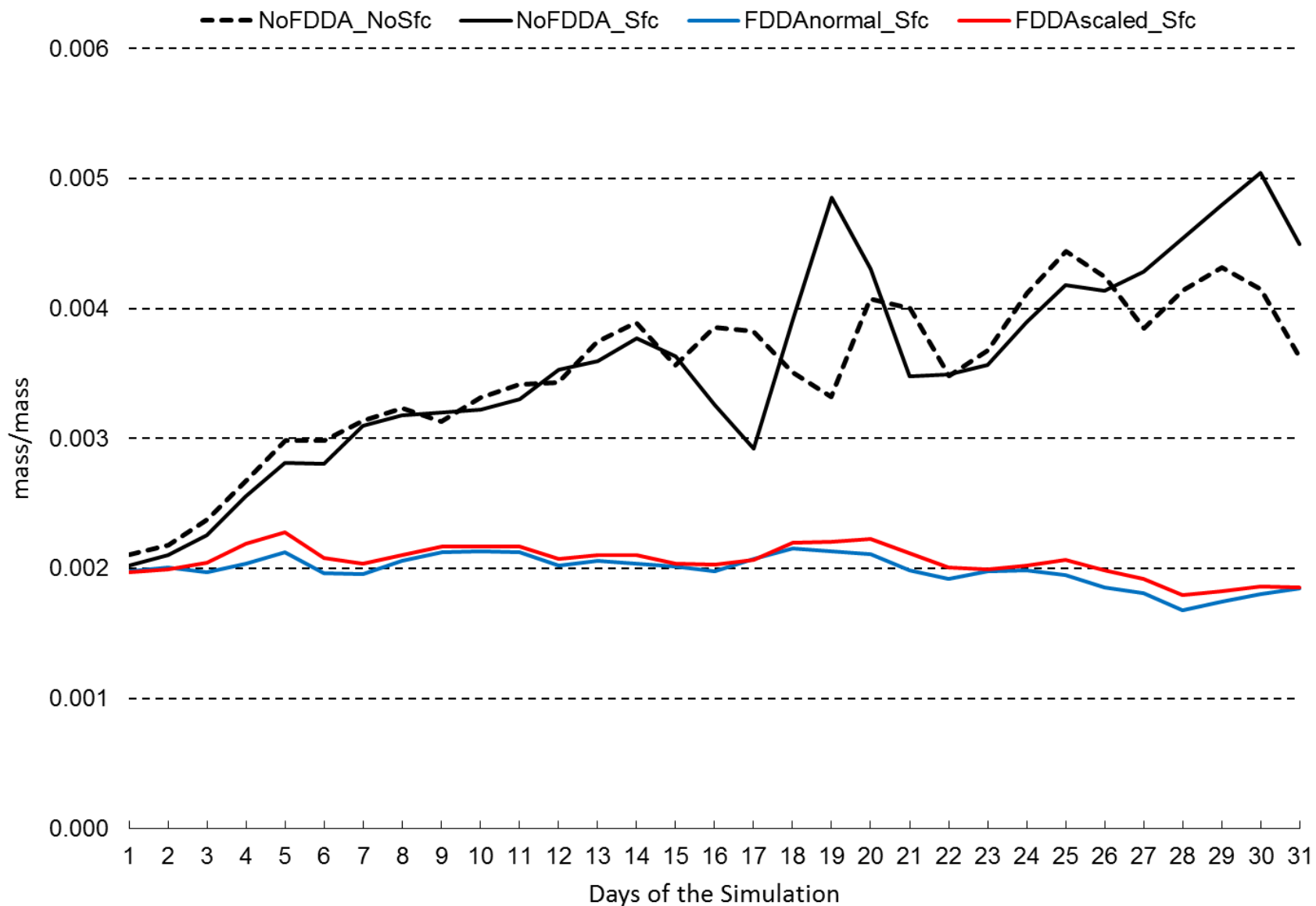
67-125°W : 25-50°N

2-m Temperature - RMS Error



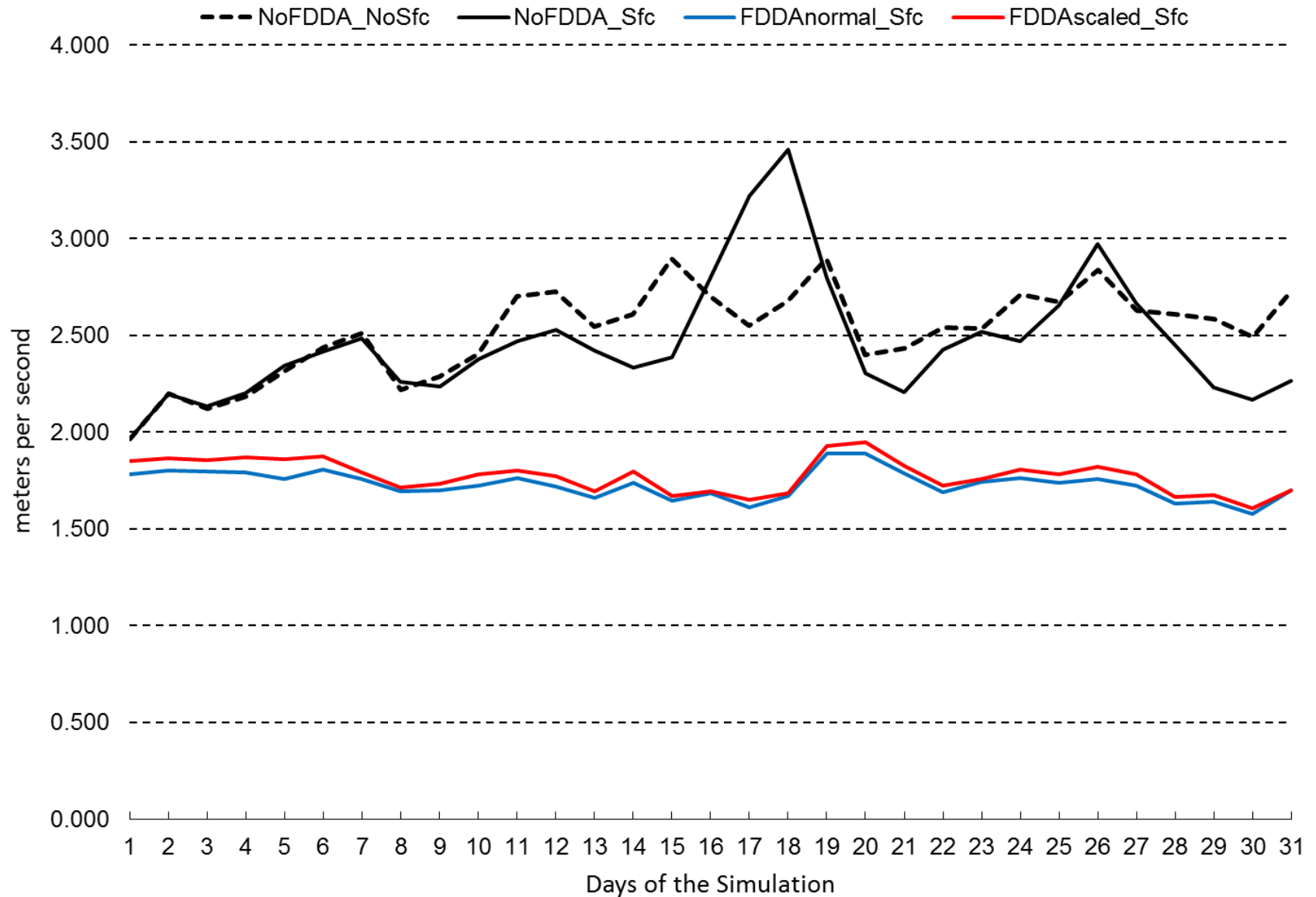
67-125°W : 25-50°N

2-m Water Vapor Mixing Ratio - RMS Error



67-125°W : 25-50°N

10-m Wind Speed - RMS Error



Mass Conservation?

- Code was added to dynamics/mpas_atm_time_integration.F to calculate and report total dry air mass and total water vapor mass at each time step.
- The standard MPAS-Atmosphere did a very good job of conserving the total mass of dry air during July 2013. ($\pm 0.003\%$)
- Of course, water vapor was not so constant ($\pm 0.3\%$)
- All applications of FDDA showed similar conservation of dry air
- Water vapor in FDDA applications tended to increase about 2% in the first few days and then fluctuate within $\pm 1\%$.

Summary and Future Work

- The new FDDA capability constrains model errors to the same magnitudes found at the start of the simulation.
- Mass conservation (w.r.t. dry air) is not degraded. Nudging water vapor mixing ratio obviously disrupts total mass balance.
- Model errors are somewhat sensitive to the nudging strength and weaker nudging for smaller mesh cells can reduce error.
- U.S. EPA will continue to test and refine the technique.
- FDDA will be offered to the MPAS Development Team for inclusion in future published versions.

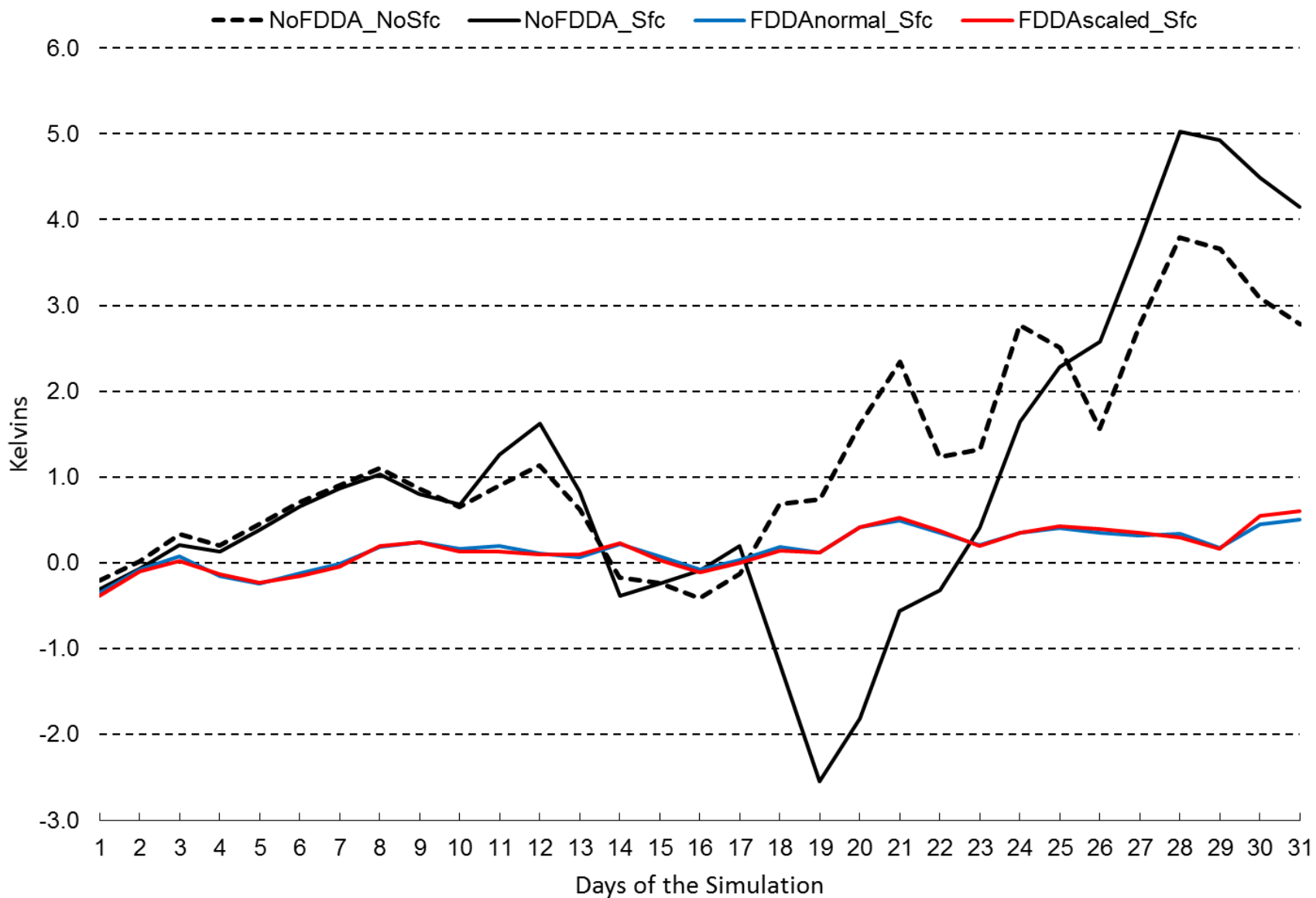
References

- Stauffer, D. R., and N. L. Seaman, 1990: Use of four-dimensional data assimilation in a limited-area model. Part I: Experiments with synoptic-scale data. *Mon. Wea. Rev.*, 118, 1250–1277.
- Stauffer, D. R., and N. L. Seaman, 1994: Multiscale four-dimensional data assimilation. *J. Appl. Meteor.*, 33, 416–434.

Questions?

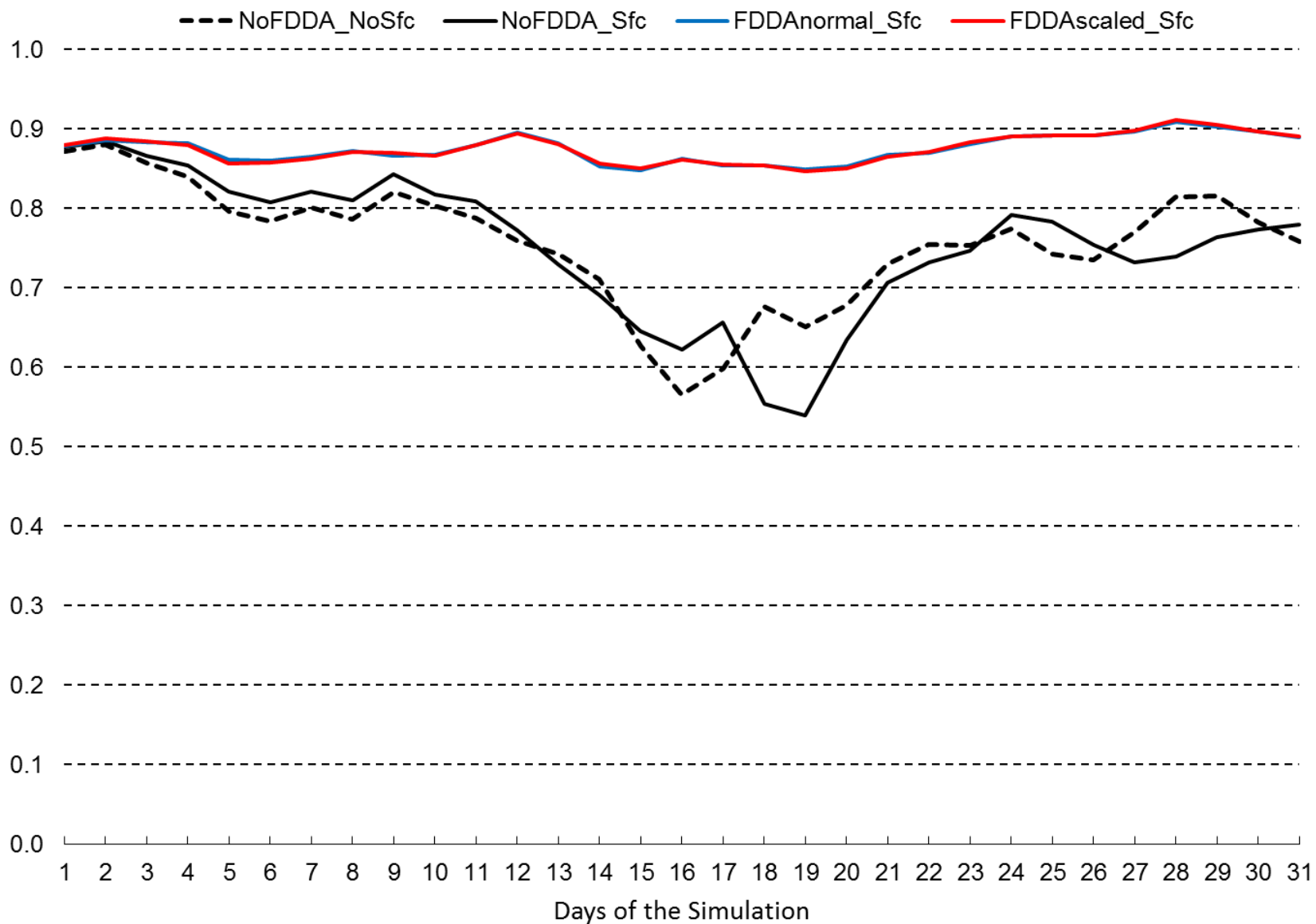
67-125°W : 25-50°N

2-m Temperature - Bias



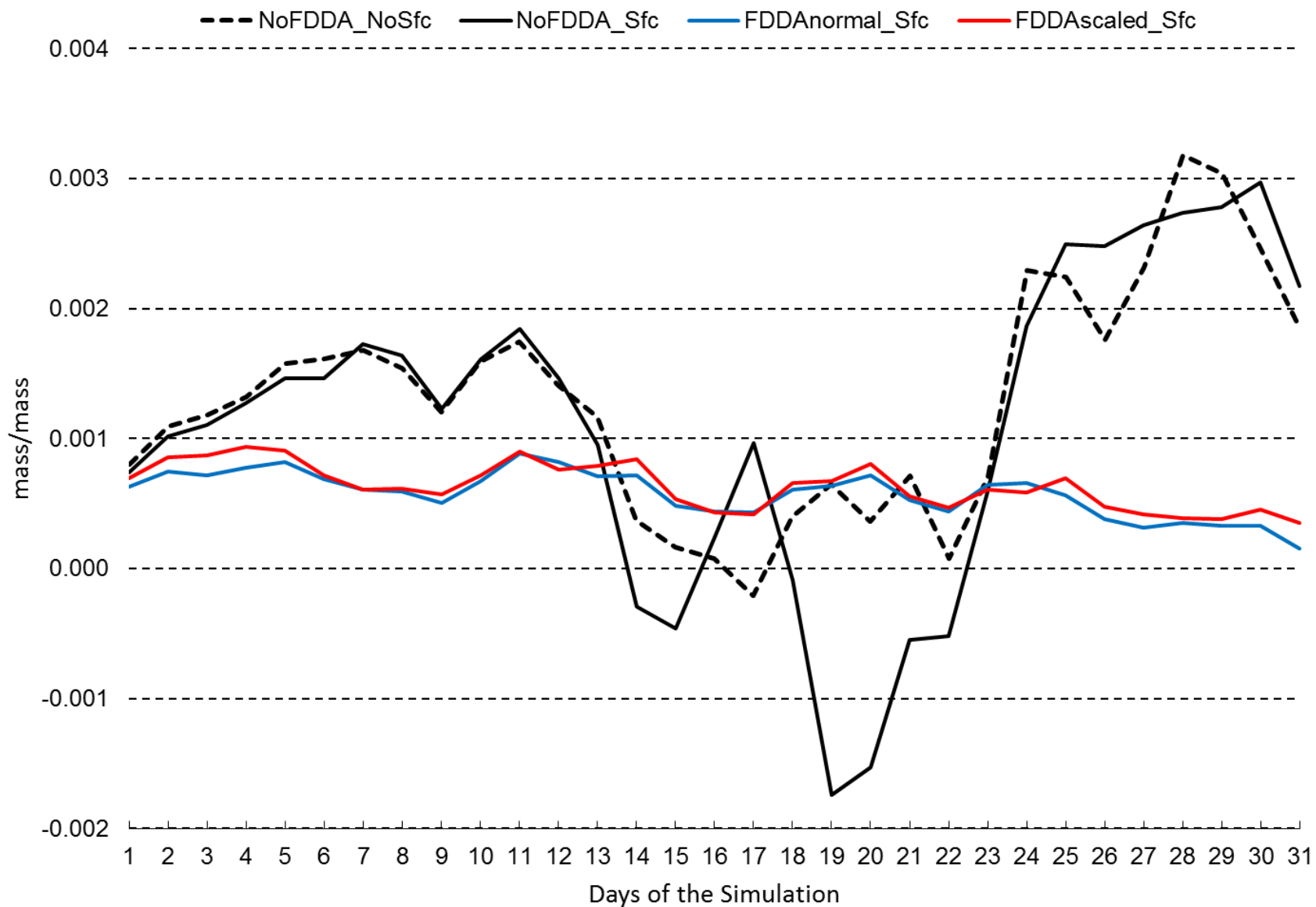
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2-m Temperature - Correlation



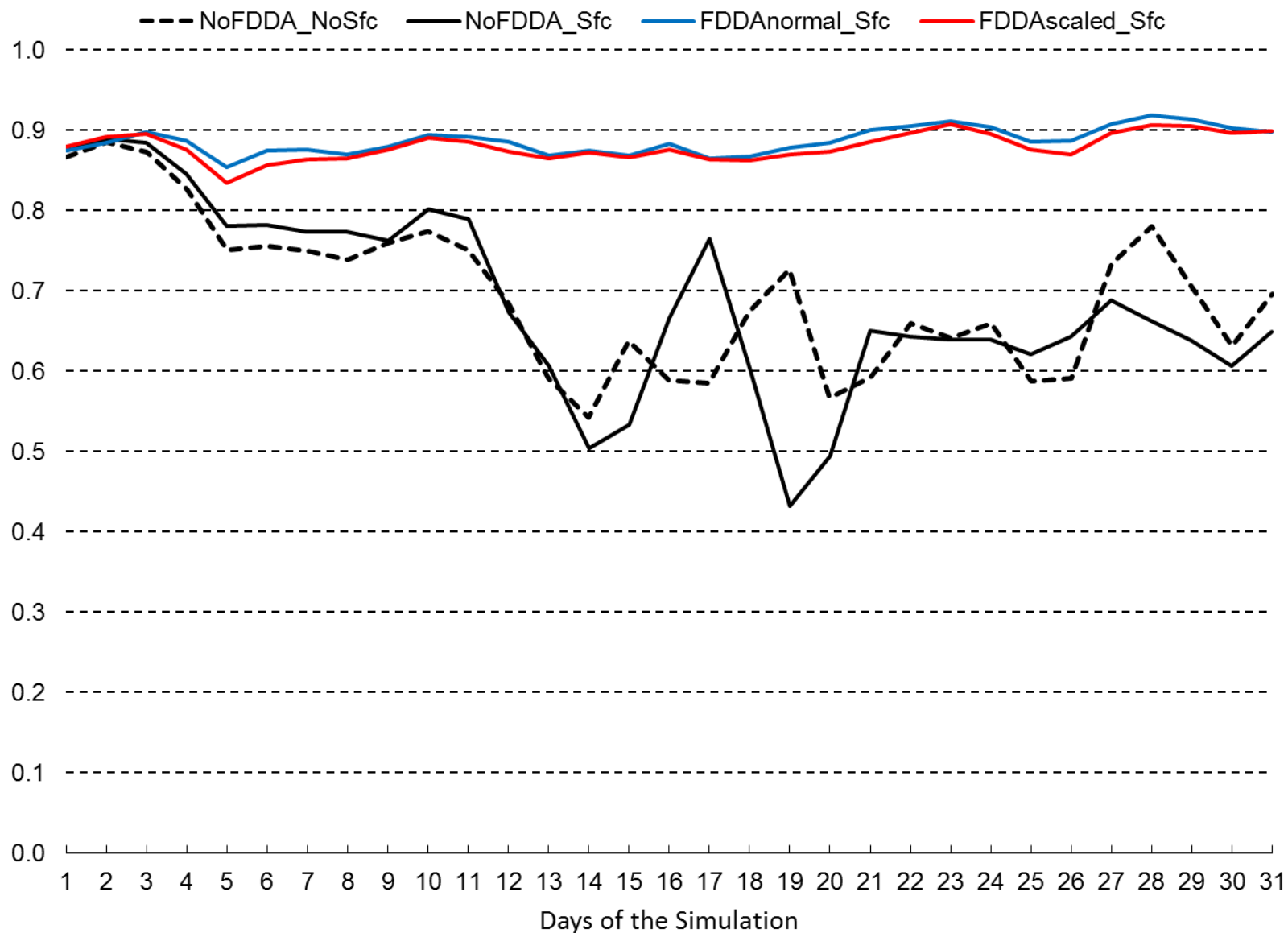
67-125°W : 25-50°N

2-m Water Vapor Mixing Ratio - Bias



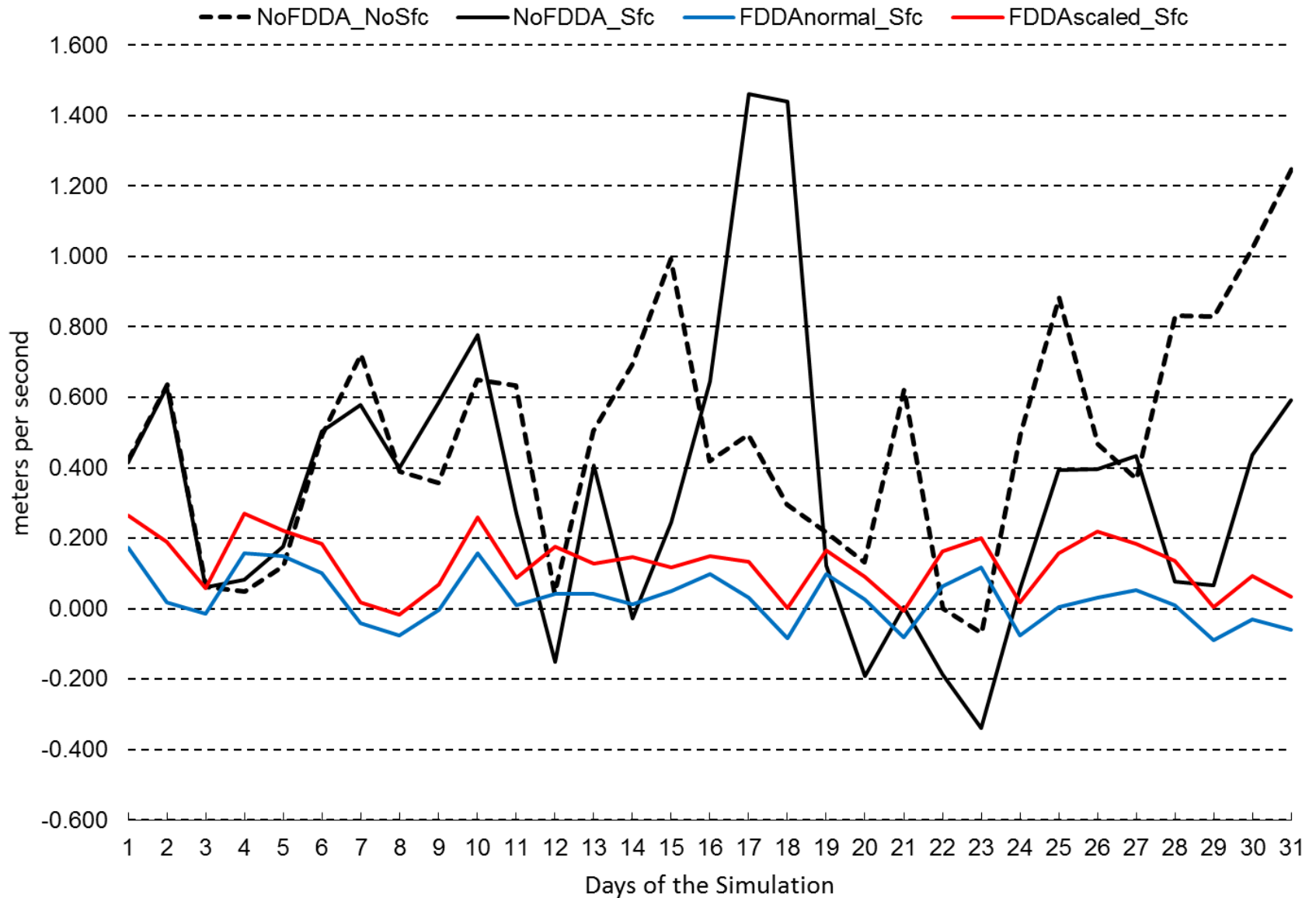
67-125°W : 25-50°N

2-m Water Vapor Mixing Ratio - Correlation



67-125°W : 25-50°N

10-m Wind Speed - Bias



67-125°W : 25-50°N

10-m Wind Speed - Correlation

