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Validation Test Report for the NRL Ocean Surface Flux (NFLUX) Quality Control and 2D Variational Analysis System

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EXECUTIVE SUMMARY

The Naval Research Laboratory (NRL) Ocean Surface Flux System Version 1 (NFLUX) provides observation processing, quality control, and analysis of measurements of ocean surface state variables for application with ocean models. The NFLUX system consists of three components: processing satellite retrievals of ocean surface state variables (NFLUX PRE), automated quality control of the observations (NFLUX QC), and 2D variational analyses of the satellite and *in situ* data with atmospheric models (NFLUX VAR). This document will review and present the current capability of the second and third components of the NFLUX system, which leverage the Navy Coupled Ocean Data Assimilation (NCODA) system. The first component of the NFLUX system is described in a separate report.

The three gridded analysis fields produced by the NFLUX system are 5-meter air temperature, 5-meter specific humidity, and 10-meter wind speed. NFLUX produces 6-hourly global and regional analysis fields, which are compared to current operational ocean forcing models (i.e. NOGAPS and COAMPS), and validated against 2 years of *in situ* observations.

The assimilated data include: Advanced Microwave Sounding Unit (AMSU) and Special Sensor Microwave Imager/Sounder (SSMIS) satellite data records (SDR), Windsat environmental data records (EDR), and *in situ* data. AMSU data are available from the National Oceanic and Atmospheric Administration (NOAA) and European Organization for the Exploitation of Meteorological Satellites (EUMETSAT) platforms. SSMIS data are available from the Department of Defense (DoD) platforms. Windsat data are from the Coriolis platform.

NFLUX and NOGAPS/COAMPS air temperature comparisons were found to be very similar. Each of the models showed a low mean bias, high correlation, and high overall skill compared to *in situ* observations. Each model shows an extended area of relatively constant temperatures within the Western Pacific warm pool. This feature is also seen when model sea surface temperatures are compared to *in situ* observations. Further work is needed to resolve this issue.

NOGAPS/COAMPS specific humidity shows a capping effect above approximately 28 g/kg. NFLUX applies a correction to high specific humidity values to account for the capping; however, the correction also causes more scatter/noise. In the tropics, NFLUX shows a strong moist bias, while NOGAPS/COAMPS show a strong dry bias. Compared to *in situ* observations, NFLUX shows a lower mean bias than NOGAPS/COAMPS. However, NFLUX also shows a lower correlation, due to the greater scatter, which results in a lower overall skill.

The global wind speed field is much noisier than either air temperature or specific humidity, causing wind speed correlations and overall skill to be reduced. NFLUX wind speeds were generally stronger than NOGAPS/COAMPS wind speeds. Each of the models showed high wind speed bias at less than approximately 5 m/s. Compared to *in situ* observations, NFLUX showed a smaller mean bias, higher correlation, and higher overall skill than NOGAPS/COAMPS.

1.0 INTRODUCTION

The Naval Research Laboratory (NRL) Ocean Surface Flux System Version 1 (NFLUX) processes, quality controls, and assimilates remotely-sensed and *in situ* observations to generate gridded analysis fields of ocean surface state variables used in estimating atmosphere-ocean fluxes of heat and momentum. The NFLUX system consists of three primary components. The first component retrieves measurements of near-surface atmospheric state parameters using observed brightness temperatures from passive microwave sensors including the Special Sensor Microwave Imager/Sounder (SSMIS) onboard Department of Defense (DoD) Meteorological Satellite Program (DMSP) platforms and the Advanced Microwave Sounding Unit (AMSU) onboard National Oceanic and Atmospheric Administration (NOAA) and European Organization for the Exploitation of Meteorological Satellites (EUMETSAT) platforms. Measurements of surface scalar wind speed from the Windsat sensor, as well as *in situ* observations from NOAA buoys and Voluntary Observing Ships (VOS), are also processed. The second component applies an automated quality control (QC) to all *in situ* and satellite observations. The third component performs 2D variational analyses of *in situ* and satellite observations with atmospheric model forecasts to produce gridded global and regional estimates of surface atmospheric state parameters over the ocean.

The quality control and variational analysis components of NFLUX are built on the Navy Coastal Ocean Data Assimilation (NCODA) system (Cummings, 2005), and use NCODA software to provide many underlying utility components. The NFLUX version 1 system produces global gridded fields of surface air temperature, surface specific humidity, and 10-meter scalar wind speed.

This validation report documents the performance of the NFLUX quality control and 2D analysis components in three regional studies in comparison with *in situ* observations and current operational ocean forcing products from Navy meteorological models (i.e., NOGAPS and COAMPS).

2.0 VALIDATION TEST DESIGN

2.1 Validation measures

The statistical metrics used in this report are mean error (ME), standard deviation (SD), root mean square error (RMSE), and correlation coefficient (R^2). They are expressed as follows:

$$ME = \bar{Y} - \bar{X}, \quad (1)$$

$$SD = \left[\frac{1}{n} \sum_{i=1}^n ((Y_i - \bar{Y}) - (X_i - \bar{X}))^2 \right]^{1/2}, \quad (2)$$

$$RMSE = \left[\frac{1}{n} \sum_{i=1}^n (Y_i - X_i)^2 \right]^{1/2}, \quad (3)$$

$$R^2 = \left[\frac{1}{n} \sum_{i=1}^n (X_i - \bar{X})(Y_i - \bar{Y}) / (\sigma_x \sigma_y) \right]^2, \quad (4)$$

where X_i are the *in situ* observations, Y_i are the NFLUX analysis or NOGAPS / COAMPS forecast field values, σ_x and σ_y are the corresponding standard deviations, and the overbar represents a simple average. *ME* measures the overall mean bias, *SD* is the standard deviation of the difference between the *in situ* and model data, RMSE measures the absolute error between the *in situ* and model data, and R^2 is a measure of the linear association between the model and the observation. The *ME* and *SD* are also tested for statistical significance at the 95% confidence interval, using a two-tailed t-test for *ME* and a chi-squared test for *SD*.

2.2 Verifying observations

Validation is performed on the 00Z and 12Z analysis or forecast fields. *In situ* observations assigned an error estimate of .90 or less by the NFLUX QC, and observed within three hours of the analysis time, are used to create the matchup validation data set. If multiple *in situ* observations exist at the same latitude and longitude or have the same call sign, only the closest in time to the analysis time is used.

Performance measures are calculated separately for matchup datasets of (nominally) assimilated and unassimilated *in situ* observations. In the assimilated data comparisons, we presumed that the *in situ* observations were available for assimilation in the analysis for that forecast (for both NFLUX and the model forecast fields). The assimilated *in situ* data comparisons are made for NFLUX analysis fields, model analysis fields, and model 12 h forecast fields. For example, NFLUX analysis and model analysis fields from 12Z 1 January and 12 h model forecast fields from 00Z 1 January are verified against *in situ* observations from 12Z 1 January.

The unassimilated *in situ* data comparisons are performed by persisting NFLUX and forecast model fields forward 12 h, and validating against verifying *in situ* observations that we presume were not assimilated in that cycle based on the observation time. For example, NFLUX analysis and model analysis fields from 12Z 1 January are verified against *in situ* observations from 00Z 2 January. We considered using 24 h persistence instead of 12 h to match the diurnal cycle; however, we found the skill was greatly reduced due to the short atmospheric time scales.

These comparisons are relevant to an operational implementation of NFLUX used to post-processes meteorological model forecast output for ocean model initialization. A comparison of persisted NFLUX analyses against valid atmospheric model forecast fields using unassimilated observations was not performed, as it would not be relevant to the skill of an operational NFLUX system. The NFLUX system is not intended to provide forecast ocean surface state variables.

The matchups are further divided to distinguish performance on coastal areas versus the open ocean: the full global set includes all matchups in the data set, the coastal subset includes matchups within 111 km of land, and the open ocean subset includes matchups greater than 111km of land. The open ocean subsets are further divided by season: December-January-

February (DJF); March-April-May (MAM); June-July-August (JJA); and September-October-November (SON). The open ocean subset for the global test case is also examined by latitude band: 90°S to 15°S, 15°S to 0°N, 0°N to 15°N, 15°N to 30°N, 30°N to 45°N, 45°N to 90°N.

2.3 Analysis domains

We examine validation datasets for three test cases: global, western Pacific, and eastern Pacific, from 1 January 2010 through 31 December 2011 for each case. The NFLUX grid characteristics of each domain are given in Table 1, while a map outlining the boundaries of each region is shown in Figure 1. The global test case allows for large scale biases to be investigated. The western Pacific test case covers multiple areas of Navy interest, and includes the significant air-sea interaction associated with the Kuroshio front in the East China Sea (e.g., Xu et al., 2011). The eastern Pacific test case represents a basin area with frequent winter storms (e.g. Graham and Diaz, 2001) and persistent coastal stratus clouds (e.g., Klein and Hartmann, 1993).

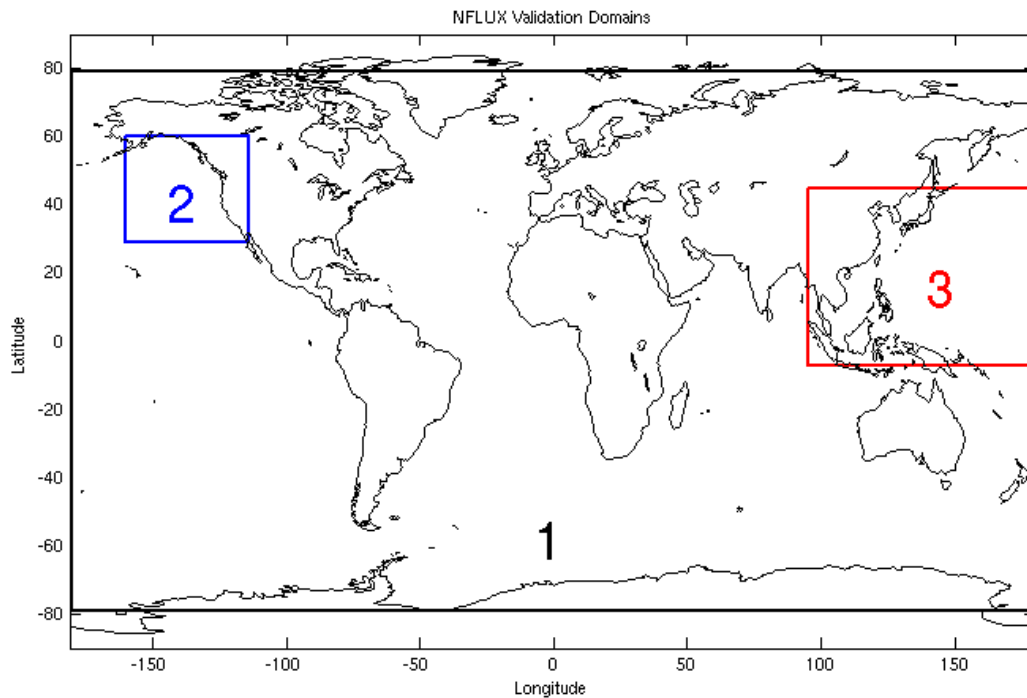


Figure 1: Validation test case domains. Three regions were chosen to represent different atmospheric features.

Table 1: Validation test case grids. The test case grid domains match those provided by NOGAPS/COAMPS.

| Test Case | Area | Latitude Range | Longitude Range | Grid Resolution | Grid Points |
|-----------|--------------|--------------------|-----------------|-----------------|-------------|
| 1 | Global | 79.15°S to 79.15°N | 180°W to 180°E | 24 km | 1669 x 1251 |
| 2 | East Pacific | 29°N to 60°N | 160°W to 114°W | 0.2 degrees | 231 x 156 |
| 3 | West Pacific | 7°S to 45°N | 95°E to 180°E | 0.2 degrees | 426 x 261 |

2.4 Analysis products

2.4.1 *NOGAPS*

The Navy Operational Global Atmospheric Prediction System (NOGAPS) is a complete atmospheric forecast and data assimilation system used to produce global predictions of atmospheric and oceanic parameters (Hogan and Rosmond, 1991). The focus is on relatively short time scales of numerical weather prediction, as opposed to climate; therefore, a one-way coupling strategy is implemented. The assimilation of new data (update cycle) occurs every 6 hours, with forecast fields available every 3 hours. NOGAPS uses the NRL Atmospheric Variational Data Assimilation (NAVDAS) – Accelerated Representer (AR) system, an operational four-dimensional weak-constraint data assimilation system (Xu et al., 2005; Rosmond and Xu, 2006). The SST analysis used within NOGAPS is produced by NCODA and is updated twice a day using a 24 hour data window, which eliminates any diurnal effects. The SSTs are kept constant throughout the forecast period. The global test case uses the NOGAPS atmospheric model forecast fields archived in the NRL Code 7300 archive. The NOGAPS fields are application-grid data that have been interpolated to a uniform 0.5° resolution. We use the NOGAPS 2 m air temperature, 2 m specific humidity (estimated from the model 2 m dew point depression and the air temperature), and 10 m wind speed. At the time of this study, NOGAPS was the primary source of forcing for U.S. Navy global ocean models. As of 13 March 2013, NOGAPS was replaced by the Navy Global Environmental Model (NAVGEM).

2.4.2 *COAMPS*

The Coupled Ocean Atmosphere Prediction System (COAMPS) is used to make regional predictions of atmospheric and oceanic parameters (Hodur, 1997). Like NOGAPS, COAMPS consists of complete data assimilation and forecast model components. The U.S. Navy uses COAMPS for numerical weather predictions in various regions around the world, and forcing for regional and coastal ocean models. The update cycle is every 6 hours, with forecast fields available every 3 hours. The NAVDAS data assimilation system is used to produce the COAMPS analyses. The SST analysis used within COAMPS is produced using the same method as described for NOGAPS. The regional test cases use the COAMPS atmospheric model forecast fields archived in the NRL Code 7300 archive. The COAMPS fields used are application-grid data interpolated to a uniform 0.2° resolution. We use the COAMPS 2 m air temperature, 2 m specific humidity (estimated from the model 2 m dew point depression and the air temperature), and 10 m wind speed.

2.4.3 *NFLUX*

The NFLUX version 1 system produces global gridded fields of air temperature, specific humidity, and scalar wind speed over the ocean surface. The NFLUX system was cycled with a six-hourly update cycle from 1 January 2010 through 31 December 2011 for each test case.

2.4.3.1 Quality Control

An automatic quality control (QC), or error estimate, is applied to all of the satellite and *in situ* observations. The QC system is built on NCODA (Cummings, 2005). The QC decision making uses both monthly climates as well as the previous NFLUX analysis field. The monthly climate fields were constructed using SeaFlux data (Curry et al., 2004). The SeaFlux project was designed to produce high quality (every 3 hours) satellite-based ocean surface turbulent flux datasets that could be used in climate studies. Input parameters (including air temperature, specific humidity, and wind speed) used to calculate the turbulent fluxes were stored, along with the fluxes, and are freely available from the SeaFlux website: www.seaflux.org. The global SeaFlux products from January 1998 through December 2007 were used to create the parameter specific monthly climate fields used in the NFLUX system.

2.4.3.2 Analysis variables

NFLUX produces analyses of nominal height 5 m (air temperature and specific humidity) and 10 m (wind speed). The satellite retrievals are based on a combination of buoy and height-adjusted ship measurements. Buoy air temperature and specific humidity observation heights are nominally at 5m. Ship measurement heights vary from 10 m to 40 m (Kent et al., 2007). When possible, we height-adjust ship measurements to 5 m air temperature and specific humidity and 10 m wind speed using COARE 3.0 (Fairall et al., 2003) to more closely correspond to typical buoy instrument heights, as buoys make up the bulk of the *in situ* measurements used in deriving the retrievals. The *in situ* and satellite temperature and humidity measurements are not further height-adjusted to 2 m to match the height associated with NOGAPS and COAMPS.

NOGAPS and COAMPS provide air temperature and wind speed fields as direct model outputs; however, the specific humidity (Q_a) fields must be calculated. Specific humidity is calculated following WMO (2006) using input air temperature (T_a), dew point depression ($dptdp$), and pressure fields ($pres$). Equations (5)-(7) describe the specific humidity calculation, where dpt is the dew point and vp is the vapor pressure.

$$dpt = T_a - dptdp \quad (5)$$

$$vp = 6.1121 * e^{\frac{17.62dpt}{24.312+dpt}} \quad (6)$$

$$Q_a = \frac{0.622 * vp}{pres - 0.378 * vp} \quad (7)$$

2.4.3.3 Observation handling

Both satellite and *in situ* observations were required to have a QC value of .90 or less and an observation time within three hours of the NFLUX analysis run time in order to be assimilated. The available *in situ* and satellite observations are used to form super observations at 1.5 (1.2) times the global (regional) analysis grid mesh interval. We investigated greater adjustments to

the super observations; however, this resulted in a degraded analysis. We also investigated adjustments to a secondary over-sampling option, but the impact on the results was minimal, and the super observation technique above was maintained.

2.4.3.4 Prediction fields

The prediction or background field for each NFLUX analysis blends a model forecast (NOGAPS or COAMPS) with the previous NFLUX analysis increment field. The increment field is a gridded correction field, applied to the prediction field to produce the analysis field. We tested several additional techniques not presented here for defining appropriate background fields for the NFLUX analyses, including using persisted NOGAPS or COAMPS analysis fields, using only the previous NFLUX analysis field, and using multiple previous analysis fields. We determined that the blending of the NOGAPS (COAMPS) forecast with previous NFLUX analysis fields gave the best performance. Using the blending approach, we found that adding multiple previous NFLUX analyses fields produced similar results, so we include only the one previous NFLUX analysis correction. Using the NOGAPS (COAMPS) analysis fields rather than the forecast fields gave a slight improvement, but the validation testing here is performed as if in a real-time system in which the next NOGAPS (COAMPS) analysis may not yet be available.

2.4.3.5 Correlation Length scales

Each of the surface forcing parameters has its own spatial correlation scale, or prediction error covariance structure. The NCODA ocean analysis by default uses the climatological ocean first baroclinic mode, Rossby radius of deformation, as a basis for the correlation length scales that define the covariance structure. The NFLUX analysis similarly uses a set of climatological length scales to define the horizontal covariances.

To estimate error covariance length scales, we used a time series of 0.5° NOGAPS 12 h forecasts and verifying analyses for each parameter, every 2 days at 00 Z for 6 years (2005-2010). We chose this set up to sufficiently sample a wide variety of atmospheric conditions. At each verifying time, an error field was calculated as the difference between the 12 h forecast field and the verifying analysis field. At every point on a uniform 1° grid, neighboring error values from the difference field were accumulated in 50 km bins, from 50 km to 500 km, and the bin covariances were fit with a Gaussian function. The characteristic scale of the Gaussian function was defined as the length scale at that grid point. The time series of correlation length fields were then averaged, and a two-way smoothing filter was applied to produce the final error correlation length scales that are used in the NFLUX system (Figure 2). The length scales are used as the basis for the analytical-form horizontal covariance structure in each of the test cases. The second-order autoregressive (SOAR) form was used as the analytical covariance structure.

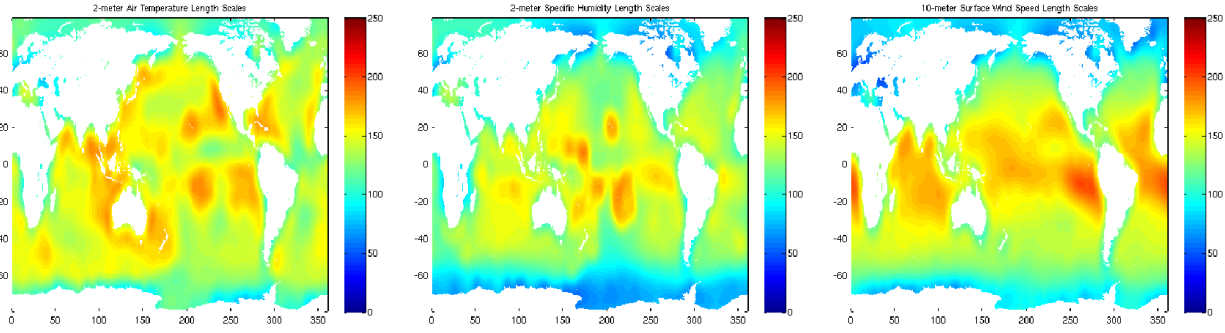


Figure 2: NFLUX horizontal length scales. Each surface parameter has a unique length scale. Air temperature is shown on the left, specific humidity is shown in the middle, and wind speed is shown on the right.

3.0 TEST CASE 1: GLOBAL

The global domain spans from 0-360°E and 79.15°S-79.15°N with a horizontal resolution of 24 km. The Mercator grid has 1669 x 1251 grid points. The NOGAPS 12 h forecast field is blended with the previous NFLUX correction field to generate the background field for the NFLUX analysis. NFLUX analysis performance is compared against NOGAPS analysis fields and NOGAPS 12 h forecast fields. Validation statistics are calculated for assimilated and unassimilated *in situ* matchup data.

3.1 Air Temperature Results

Figure 3 shows mean air temperature error using unassimilated *in situ* observations of the NFLUX analyses (top) and the NOGAPS analyses (bottom) over the full 2 year data set. Both NFLUX and NOGAPS show non-zero mean biases compared to the *in situ* observations, with large areas of noticeable cold or warm bias. The overall spatial pattern of the biases is similar in NFLUX and NOGAPS, with warm biases in the western Pacific and north Atlantic, and cool biases in the central Pacific. NFLUX is too warm in the eastern Pacific and the west coast of South Africa, and too cool in the eastern Mediterranean, while NOGAPS is too cool in the western North Pacific and the eastern tropical Atlantic.

Figure 4 shows the 2 year gridded global mean air temperature difference between NFLUX and NOGAPS (left), with the zonal average of the difference (right). The zonal average represents the average at constant latitude. Generally, NFLUX has warmer temperatures than NOGAPS. This is most noticeable along the Gulf Stream, Kuroshio Current, and in the tropics. This agrees well with warm bias areas identified in NFLUX and a wide cold bias in NOGAPS from Figure 3. In the Southern Ocean, NFLUX has cooler air temperatures than either of the NOGAPS products. There are few to none *in situ* matchups to validate this region (see Figure 3), so it is only noted here as an area of differences.

While Figure 3 and Figure 4 qualitatively show long term differences between NFLUX and NOGAPS, we can further investigate these differences quantitatively using assimilated and unassimilated *in situ* matchups. The left (right) side of Table 2 compares NFLUX to NOGAPS air temperature using assimilated (unassimilated) *in situ* observations. The means and standard deviations were tested at the 95% confidence level and each was found to be significantly different compared to NFLUX.

As seen in Table 2 for the open-ocean, both NFLUX and NOGAPS compare better to the assimilated data rather than the unassimilated. NOGAPS shows slightly better test statistics using assimilated observations, while NFLUX shows improvement over NOGAPS using unassimilated observations.

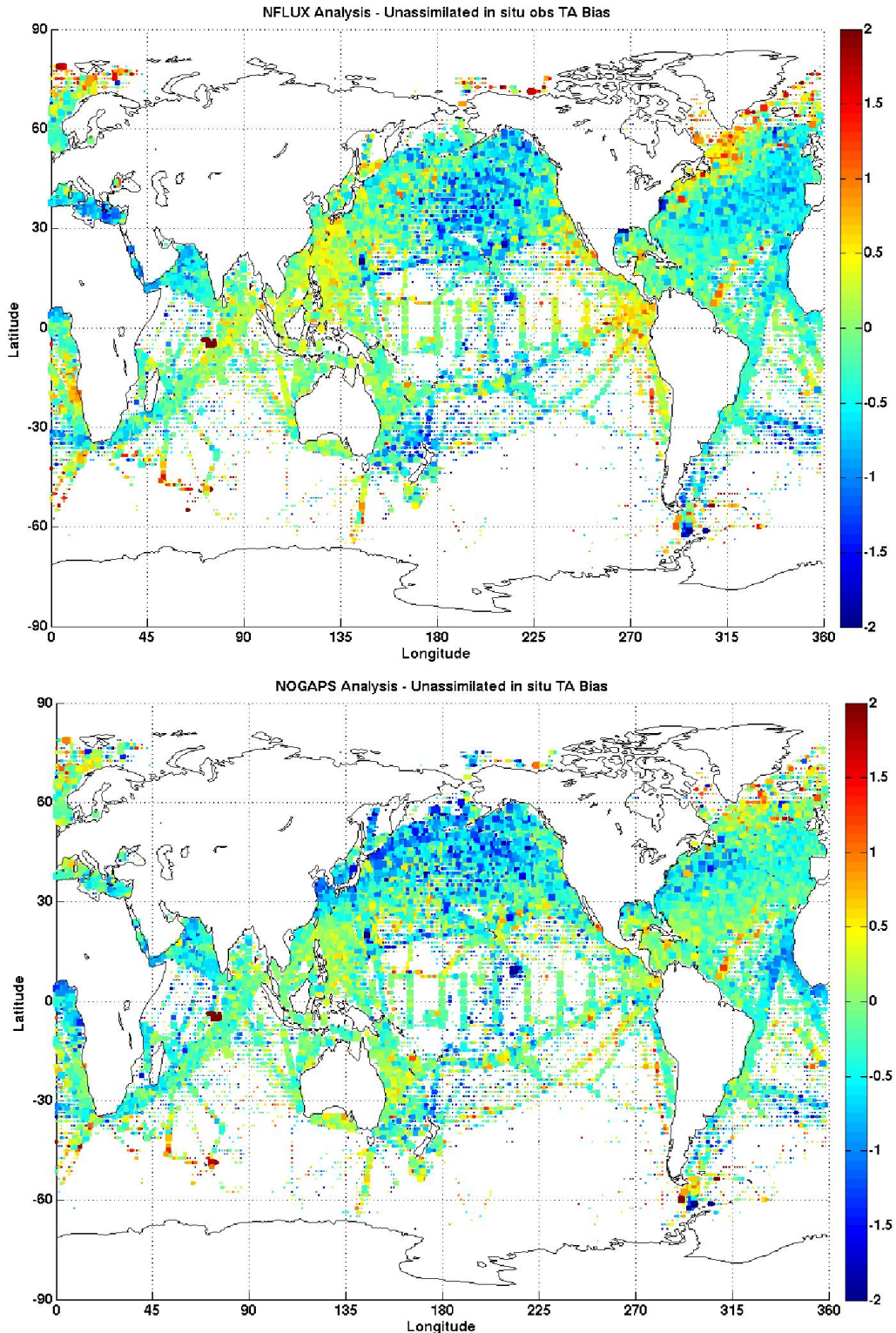


Figure 3: Global 2-year average air temperature bias (°C). The NFLUX (NOGAPS) bias compared to unassimilated observations is shown in the top (bottom) panel. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

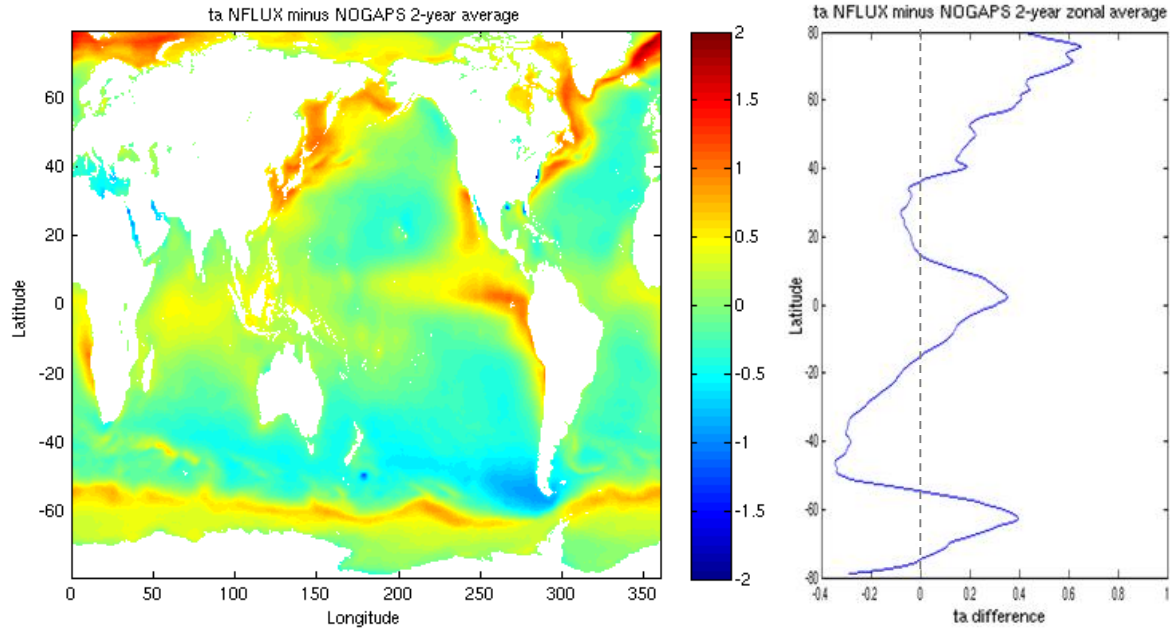


Figure 4: Global 2-year average NFLUX minus NOGAPS air temperature difference (°C). The left panel shows the global gridded difference. The right panel shows the zonally averaged difference.

Table 2: Air temperature errors over the global ocean. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (global), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Global N = 778480 | | | | | | | | | |
| NFLUX Analysis | -0.1560 | 1.6099 | 1.6175 | 0.9634 | NFLUX 12h persist | -0.1681 | 1.9984 | 2.0055 | 0.9440 |
| NOGAPS Analysis | -0.1272 | 1.5519 | 1.5571 | 0.9663 | NOGAPS 12h persist | -0.1391 | 2.0691 | 2.0738 | 0.9407 |
| NOGAPS 12h fcst | -0.0310 | 1.5723 | 1.5726 | 0.9652 | | | | | |
| Coastal N = 343842 | | | | | | | | | |
| NFLUX Analysis | -0.2043 | 2.0805 | 2.0905 | 0.9294 | NFLUX 12h persist | -0.2259 | 2.6465 | 2.6562 | 0.8873 |
| NOGAPS Analysis | -0.0646 | 1.9859 | 1.9870 | 0.9384 | NOGAPS 12h persist | -0.0829 | 2.7415 | 2.7427 | 0.8843 |
| NOGAPS 12h fcst | 0.0272 | 2.0201 | 2.0203 | 0.9354 | | | | | |
| Ocean N = 434638 | | | | | | | | | |
| NFLUX Analysis | -0.1179 | 1.1021 | 1.1084 | 0.9820 | NFLUX 12h persist | -0.1225 | 1.2678 | 1.2737 | 0.9762 |
| NOGAPS Analysis | -0.1768 | 1.0901 | 1.1044 | 0.9824 | NOGAPS 12h persist | -0.1835 | 1.3107 | 1.3235 | 0.9746 |
| NOGAPS 12h fcst | -0.0770 | 1.0929 | 1.0956 | 0.9823 | | | | | |

Scatterplots of the assimilated (unassimilated) open ocean matchups are shown in Figure 5 (Figure 6), along with corresponding histograms comparing the probability of the mean bias. The color scale shown in the scatterplots represents the density of observations. Warm colors represent the highest density of observations, while cool colors represent few observations.

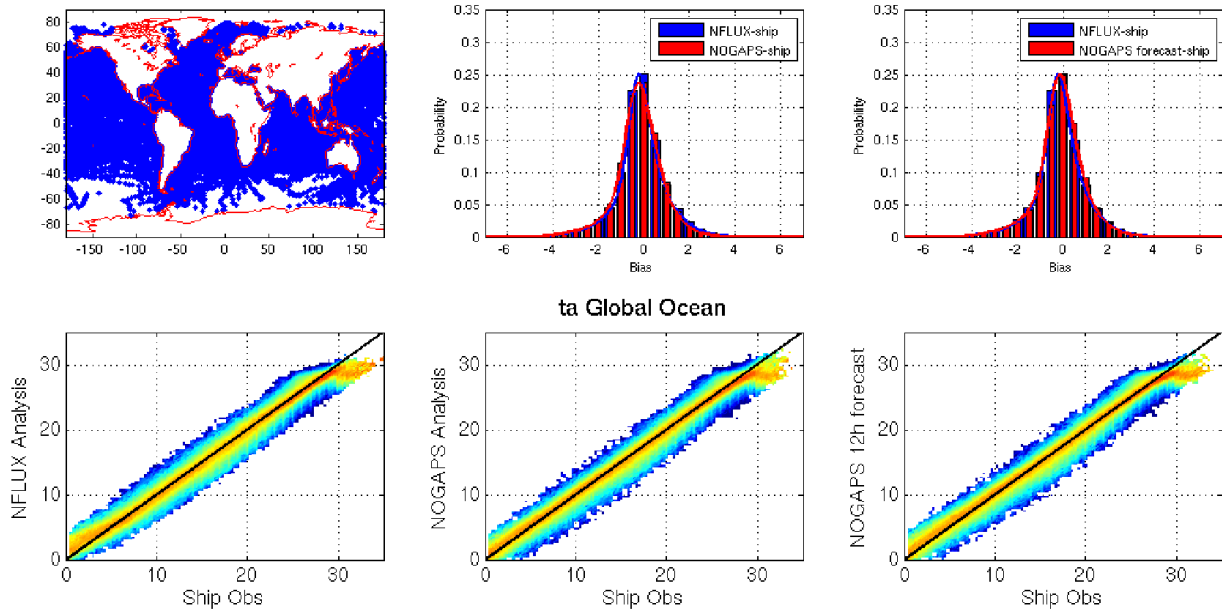


Figure 5: Air temperature over global open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The top middle (right) panel shows a histogram of the probability of the mean bias of NFLUX analysis, shown in blue, and NOGAPS analysis (NOGAPS 12-hour forecast), shown in red. The bottom panels show scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right).

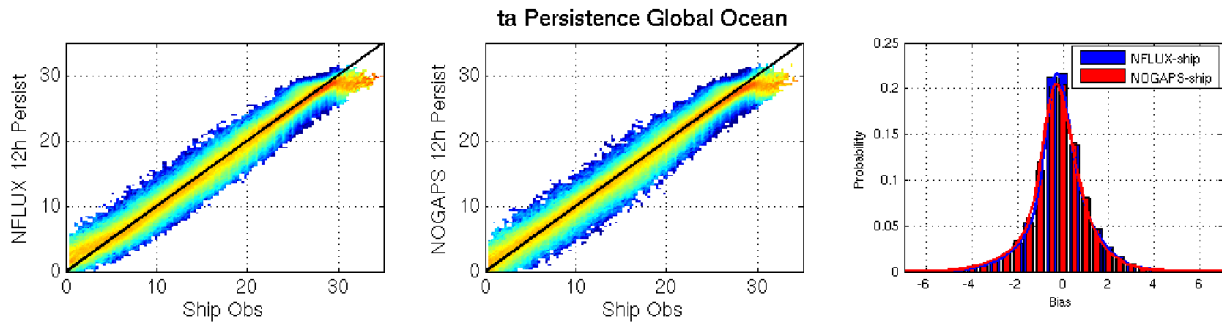


Figure 6: Air temperature over global open ocean using unassimilated *in situ* data. The right panel shows a histogram of the probability of the mean bias of NFLUX analysis (blue) and NOGAPS analysis (red). Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (middle) are also shown.

As seen in the scatterplots, each of the model products is unable to accurately represent very high temperatures resulting in a cold bias. However, NFLUX seems to have a slightly extended one-to-one relationship compared to NOGAPS. Less than approximately 30°C for NFLUX and 28°C for NOGAPS, a close one-to-one relationship can be seen in each of the model products. At very low temperatures, less than approximately 5°C, a slight warm bias is seen in NFLUX that is not present in NOGAPS.

3.1.1 Latitude Bands

The open ocean test statistics for each of the six latitude bands are presented in Table 3, with the corresponding scatterplots of the model versus assimilated (unassimilated) observations shown in Figure 7 (Figure 8). For assimilated matchups (left side of Table 3 and Figure 7), NFLUX performs better than NOGAPS in the tropical regions, from 15°S to 15°N. Outside of the tropics NOGAPS performs slightly better than NFLUX. It is interesting to note that in the 90°S to 15°S band, the standard deviations of NFLUX and the NOGAPS 12-hour forecast are not statistically different; the correlations are also very similar. For unassimilated matchups (right side of Table 3 and Figure 8), NFLUX shows overall improvement over NOGAPS in all latitude bands except 15°N to 30°N, and the mean bias in the polar bands. The 15°N to 30°N latitude band will be discussed further in the western Pacific region (section 5.1).

As discussed in the total open ocean, the scatterplots show the cold bias at high temperatures in the 90°S to 30°N latitude bands. The higher latitude bands do not have warm enough temperatures to show the bias. The warm bias seen with NFLUX at low temperatures is seen in the 30°N to 90°N latitude bands; however, it is not seen the 90°S to 15°S latitude band.

Table 3: Air temperature errors over the global open ocean by latitude band. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|---------------------|---------|------------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Latitude 45 to 90 | | N = 106514 | | | | | | | |
| NFLUX Analysis | -0.1593 | 1.2019 | 1.2124 | 0.9180 | NFLUX 12h persist | -0.1714 | 1.3847 | 1.3953 | 0.8907 |
| NOGAPS Analysis | -0.0939 | 1.1793 | 1.1831 | 0.9208 | NOGAPS 12h persist | -0.1149 | 1.4775 | 1.4819 | 0.8766 |
| NOGAPS 12h fcst | 0.0527 | 1.2173 | 1.2184 | 0.9156 | | | | | |
| Latitude 30 to 45 | | N = 64739 | | | | | | | |
| NFLUX Analysis | -0.1770 | 1.4237 | 1.4346 | 0.9452 | NFLUX 12h persist | -0.1913 | 1.7249 | 1.7355 | 0.9186 |
| NOGAPS Analysis | -0.3011 | 1.3498 | 1.3830 | 0.9504 | NOGAPS 12h persist | -0.3174 | 1.7884 | 1.8163 | 0.9140 |
| NOGAPS 12h fcst | -0.2180 | 1.3443 | 1.3619 | 0.9506 | | | | | |
| Latitude 15 to 30 | | N = 72999 | | | | | | | |
| NFLUX Analysis | -0.1204 | 1.1382 | 1.1445 | 0.9057 | NFLUX 12h persist | -0.1184 | 1.3184 | 1.3237 | 0.8721 |
| NOGAPS Analysis | -0.0920 | 1.0867 | 1.0906 | 0.9136 | NOGAPS 12h persist | -0.0903 | 1.3047 | 1.3078 | 0.8766 |
| NOGAPS 12h fcst | -0.0808 | 1.0778 | 1.0808 | 0.9143 | | | | | |
| Latitude 0 to 15 | | N = 95469 | | | | | | | |
| NFLUX Analysis | 0.0124 | 0.8497 | 0.8497 | 0.7445 | NFLUX 12h persist | 0.0144 | 0.9240 | 0.9241 | 0.6968 |
| NOGAPS Analysis | -0.1881 | 0.9127 | 0.9319 | 0.7051 | NOGAPS 12h persist | -0.1854 | 0.9456 | 0.9636 | 0.6844 |
| NOGAPS 12h fcst | -0.0583 | 0.9018 | 0.9037 | 0.7112 | | | | | |
| Latitude -15 to 0 | | N = 69195 | | | | | | | |
| NFLUX Analysis | -0.1006 | 0.7449 | 0.7516 | 0.8742 | NFLUX 12h persist | -0.1006 | 0.8002 | 0.8065 | 0.8543 |
| NOGAPS Analysis | -0.2329 | 0.7956 | 0.8290 | 0.8561 | NOGAPS 12h persist | -0.2334 | 0.8290 | 0.8612 | 0.8434 |
| NOGAPS 12h fcst | -0.1241 | 0.7735 | 0.7834 | 0.8639 | | | | | |
| Latitude -90 to -15 | | N = 25722 | | | | | | | |
| NFLUX Analysis | -0.3201 | 1.2135 | 1.2550 | 0.9617 | NFLUX 12h persist | -0.3249 | 1.3321 | 1.3711 | 0.9538 |
| NOGAPS Analysis | -0.2546 | *1.2192 | 1.2454 | 0.9614 | NOGAPS 12h persist | -0.2548 | 1.3562 | 1.3799 | 0.9521 |
| NOGAPS 12h fcst | -0.1909 | *1.1977 | 1.2128 | 0.9627 | | | | | |

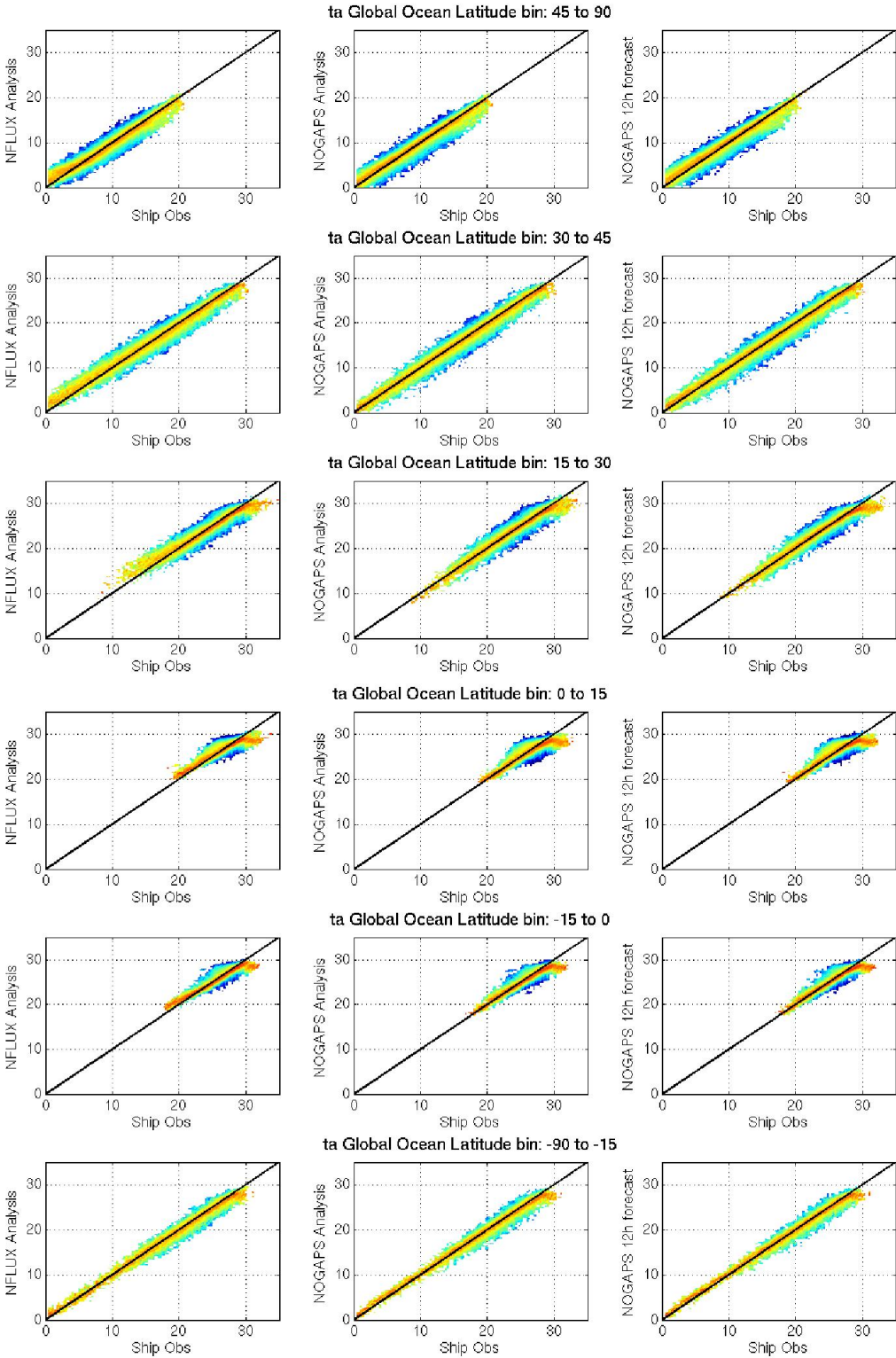


Figure 7: Air temperature over global open ocean by latitude using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right) are shown.

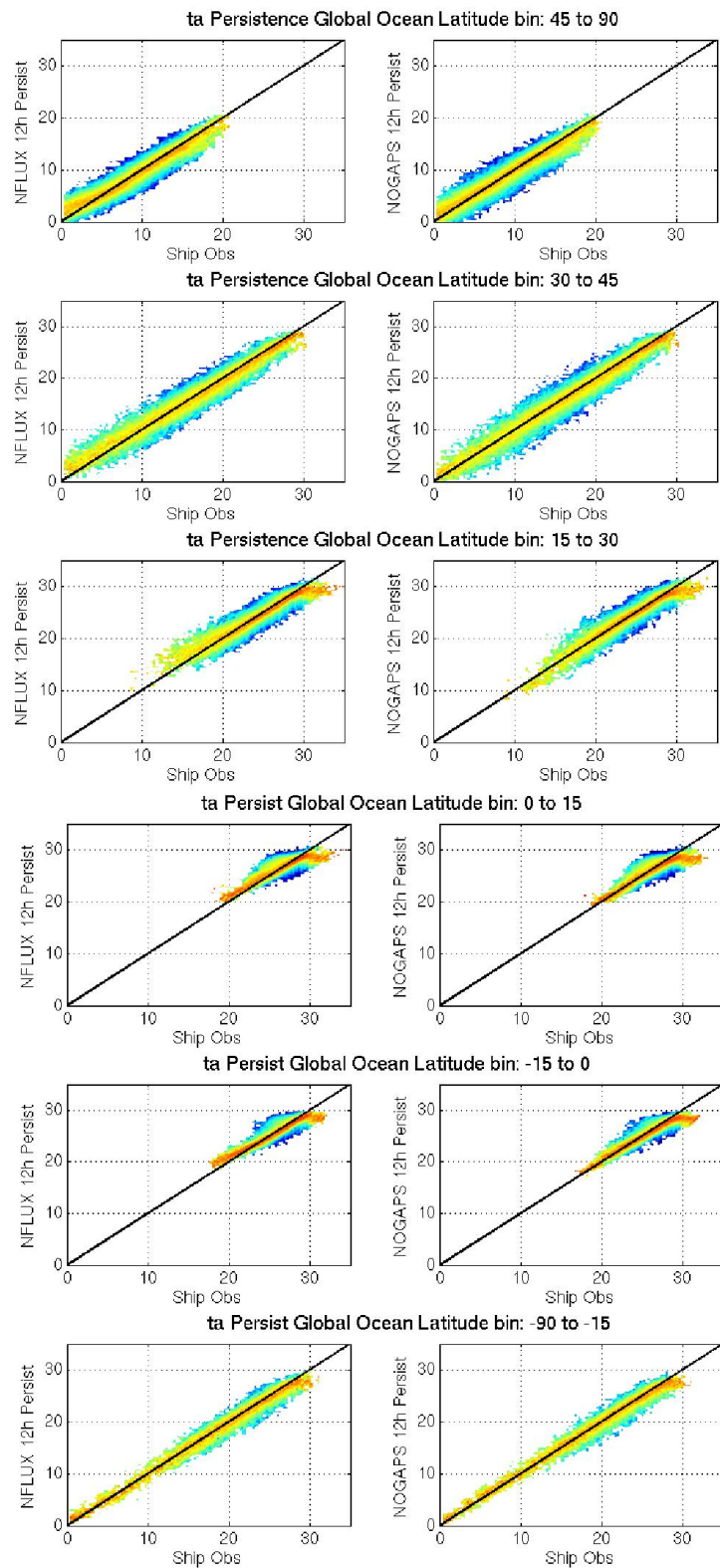


Figure 8: Air temperature over global open ocean by latitude using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (right) are shown.

3.1.2 Seasonal

The seasonal test statistics are presented in Table 4, while corresponding scatterplots of the model versus assimilated (unassimilated) observations are shown in Figure 9 (Figure 10). For assimilated matchups (left side of Table 4 and Figure 9), NFLUX and NOGAPS mean bias and standard deviations are significantly different at the 95% confidence interval for all but the MAM season. NOGAPS does have smaller errors in all but the JJA season. For unassimilated matchups (right side of Table 4 and Figure 10), NFLUX shows improvement over NOGAPS in all seasons for all test statistics, with no significant difference in the mean bias in the MAM season. Both the cold bias at high temperatures and the warm bias at low temperatures can be seen in the scatterplots for each season.

Table 4: Air temperature errors over the global open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|----------|---------|--------|----------------|--------------------|----------|--------|--------|----------------|
| DJF | | | | | N = 114819 | | | | |
| NFLUX Analysis | -0.0556 | 1.1610 | 1.1623 | 0.9839 | NFLUX 12h persist | -0.0616 | 1.3857 | 1.3870 | 0.9769 |
| NOGAPS Analysis | -0.1337 | 1.1292 | 1.1371 | 0.9847 | NOGAPS 12h persist | -0.1410 | 1.4441 | 1.4510 | 0.9749 |
| NOGAPS 12h fcst | 0.0046 | 1.1341 | 1.1341 | 0.9846 | | | | | |
| MAM | | | | | N = 99675 | | | | |
| NFLUX Analysis | -0.2519 | 1.0958 | 1.1244 | 0.9850 | NFLUX 12h persist | -0.2718 | 1.2519 | 1.2810 | 0.9805 |
| NOGAPS Analysis | *-0.2436 | *1.0872 | 1.1141 | 0.9851 | NOGAPS 12h persist | *-0.2636 | 1.2884 | 1.3151 | 0.9791 |
| NOGAPS 12h fcst | -0.1415 | 1.0861 | 1.0952 | 0.9851 | | | | | |
| JJA | | | | | N = 105815 | | | | |
| NFLUX Analysis | -0.1063 | 1.0807 | 1.0859 | 0.9757 | NFLUX 12h persist | -0.1169 | 1.1727 | 1.1785 | 0.9714 |
| NOGAPS Analysis | -0.2263 | 1.0985 | 1.1216 | 0.9751 | NOGAPS 12h persist | -0.2413 | 1.2162 | 1.2399 | 0.9696 |
| NOGAPS 12h fcst | -0.1743 | 1.1029 | 1.1166 | 0.9748 | | | | | |
| SON | | | | | N = 114329 | | | | |
| NFLUX Analysis | -0.0742 | 1.0558 | 1.0584 | 0.9793 | NFLUX 12h persist | -0.0586 | 1.2313 | 1.2327 | 0.9719 |
| NOGAPS Analysis | -0.1160 | 1.0384 | 1.0448 | 0.9800 | NOGAPS 12h persist | -0.1029 | 1.2661 | 1.2703 | 0.9703 |
| NOGAPS 12h fcst | -0.0126 | 1.0353 | 1.0354 | 0.9802 | | | | | |

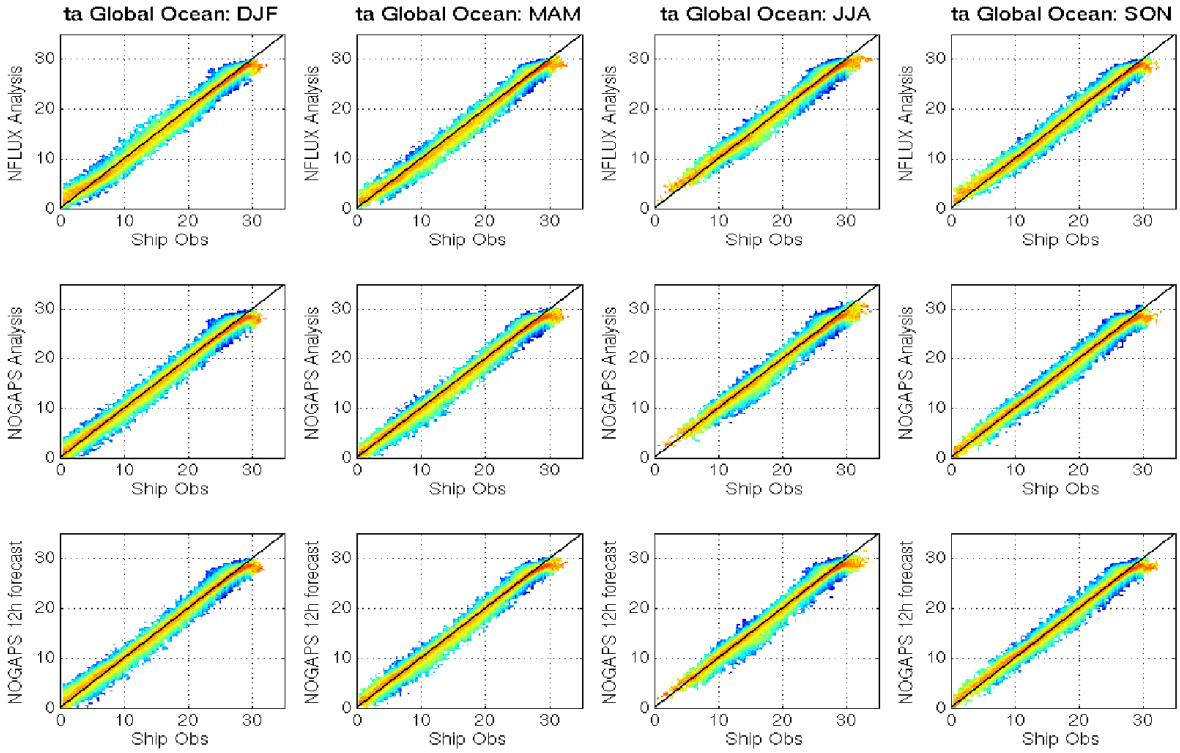


Figure 9: Air temperature over global open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (bottom) are shown.

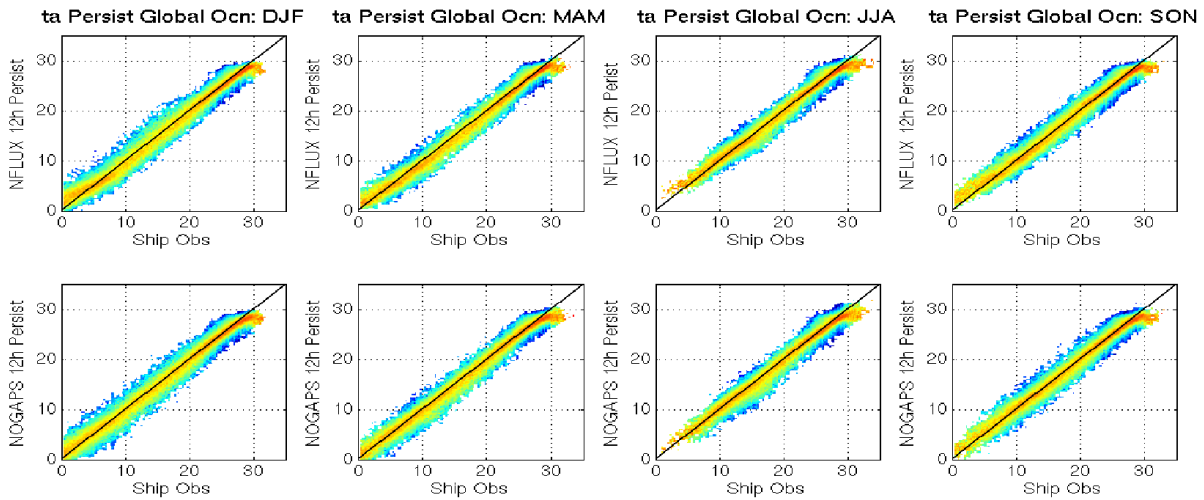


Figure 10: Air temperature over global open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top) and NOGAPS analysis (bottom) are shown.

3.2 Specific Humidity Results

Figure 11 shows mean specific humidity error using unassimilated *in situ* observations of the NFLUX analyses (top) and the NOGAPS analyses (bottom) over the full 2 year data set. NFLUX shows an overall moist bias, with the largest differences in the tropics. NOGAPS shows an overall dry bias, with the largest differences in the western Atlantic and western Pacific.

Figure 12 shows the 2 year annual specific humidity difference between NFLUX and NOGAPS (left), along with the zonal average (right). With the general warm bias in NFLUX and the cold bias in NOGAPS, it is not surprising to see the large differences between the two systems, especially within the tropics. This also agrees well with NFLUX air temperature generally being warmer than NOGAPS. Conversely, NFLUX showed cooler temperature than NOGAPS in the Southern Ocean. In this area, NFLUX also shows drier conditions than NOGAPS, although there are no *in situ* observations available for validation.

NFLUX versus NOGAPS specific humidity estimates are compared using assimilated and unassimilated *in situ* matchups (Table 5). The means and standard deviations are all significantly different. In the open ocean, NFLUX has a much smaller mean bias compared to NOGAPS using both assimilated and unassimilated matchups. However, NOGAPS has a smaller standard deviation which leads to a higher correlation compared to NFLUX.

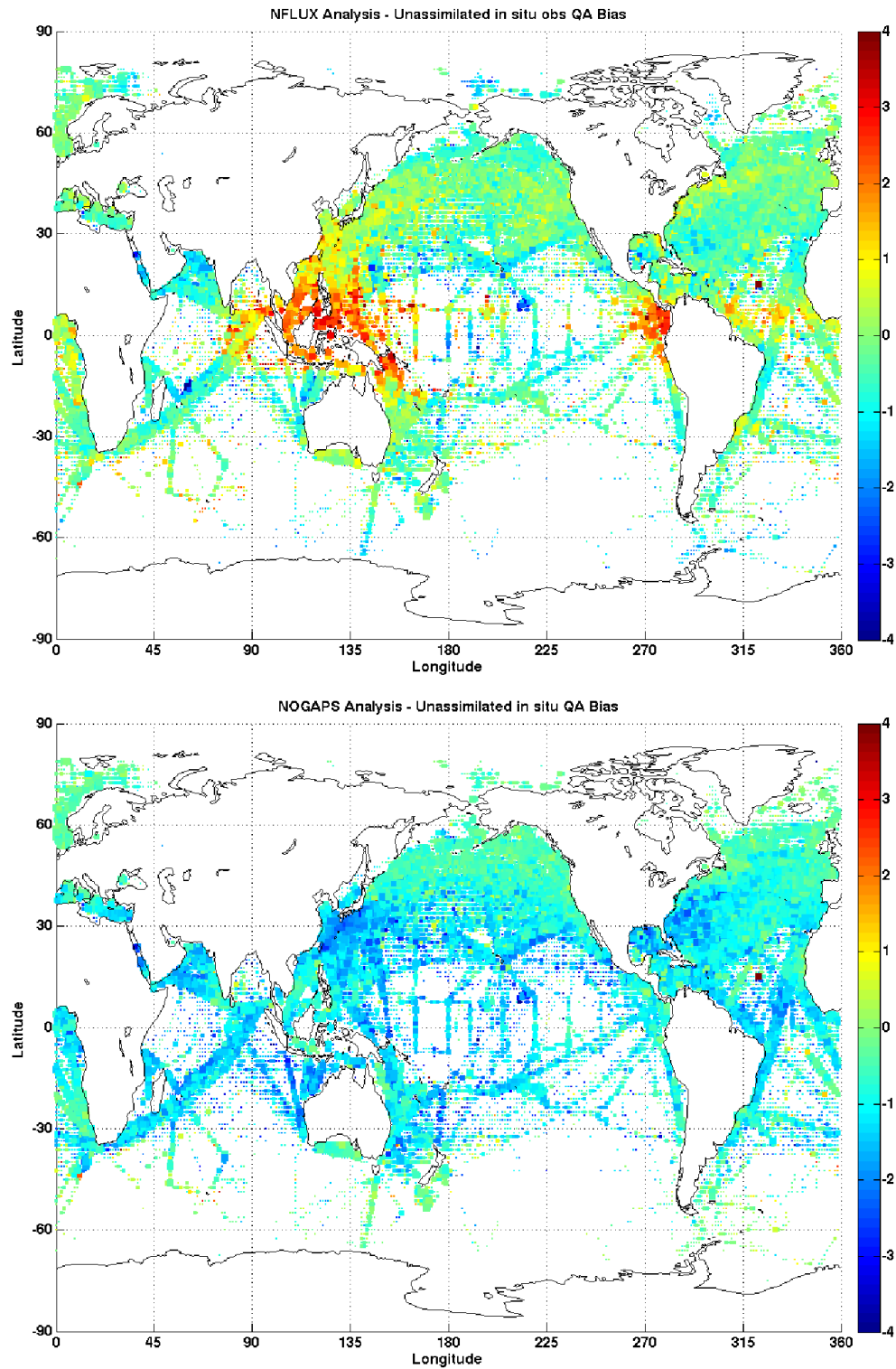


Figure 11: Global 2-year average specific humidity bias (g/kg). The NFLUX (NOGAPS) bias compared to unassimilated observations is shown in the top (bottom) panel. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

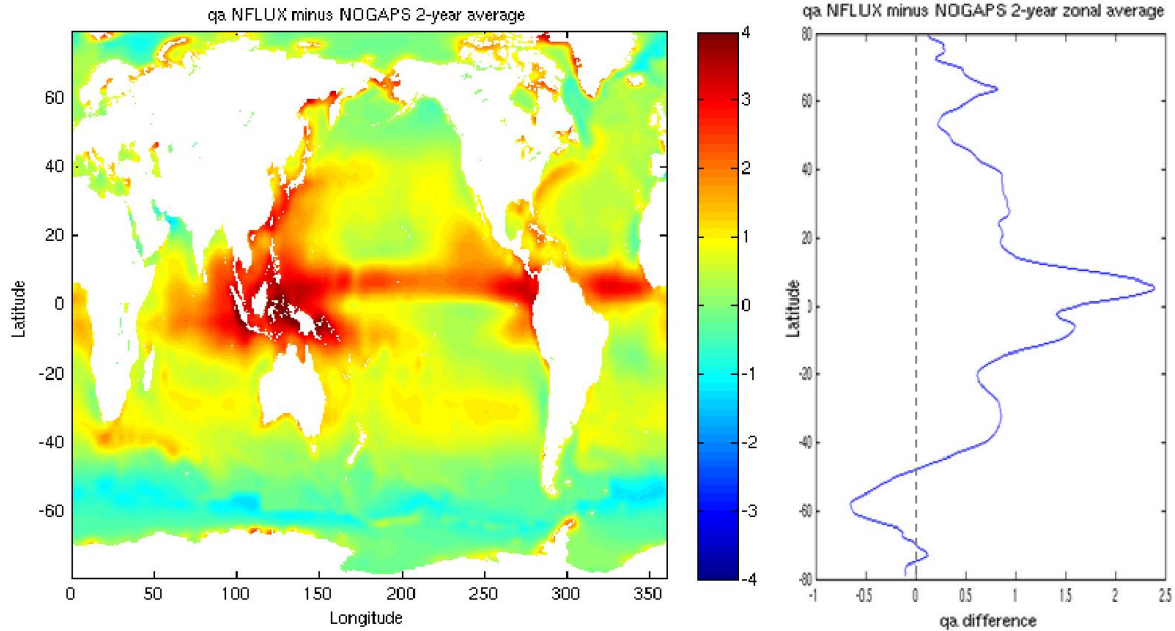


Figure 12: Global 2-year average NFLUX minus NOGAPS specific humidity difference (g/kg). The left panel shows the global gridded difference. The right panel shows the zonally averaged difference.

Table 5: Specific humidity errors over the global ocean. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (global), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Global N = 429701 | | | | | | | | | |
| NFLUX Analysis | 0.2363 | 1.9380 | 1.9523 | 0.8849 | NFLUX 12h persist | 0.2344 | 2.1288 | 2.1416 | 0.8623 |
| NOGAPS Analysis | -0.5267 | 1.8208 | 1.8955 | 0.8969 | NOGAPS 12h persist | -0.5433 | 2.0700 | 2.1401 | 0.8660 |
| NOGAPS 12h fcst | -0.7130 | 1.9554 | 2.0813 | 0.8812 | | | | | |
| Coastal N = 189510 | | | | | | | | | |
| NFLUX Analysis | 0.4299 | 2.0838 | 2.1277 | 0.8628 | NFLUX 12h persist | 0.4249 | 2.2912 | 2.3303 | 0.8350 |
| NOGAPS Analysis | -0.3838 | 2.1863 | 2.2197 | 0.8489 | NOGAPS 12h persist | -0.3920 | 2.4024 | 2.4342 | 0.8168 |
| NOGAPS 12h fcst | -0.5341 | 2.3057 | 2.3667 | 0.8318 | | | | | |
| Ocean N = 240191 | | | | | | | | | |
| NFLUX Analysis | 0.0836 | 1.8001 | 1.8020 | 0.9021 | NFLUX 12h persist | 0.0841 | 1.9783 | 1.9801 | 0.8828 |
| NOGAPS Analysis | -0.6395 | 1.4599 | 1.5938 | 0.9324 | NOGAPS 12h persist | -0.6627 | 1.7549 | 1.8759 | 0.9015 |
| NOGAPS 12h fcst | -0.8541 | 1.6127 | 1.8249 | 0.9176 | | | | | |

Scatterplots of NFLUX and NOGAPS specific humidity versus assimilated (unassimilated) *in situ* observations, as well as histograms of the probability of the mean bias, are shown in Figure 13 (Figure 14). Both the assimilated and unassimilated matchups are very similar. From approximately 4 g/kg to 18 g/kg NFLUX shows a fairly close one-to-one relationship with the *in situ* observations. In this range, NOGAPS also shows a closer linear relationship; however, the one-to-one fit is shifted to reveal an overall dry bias. Less than approximately 4 g/kg, a slight moist bias can be seen in each of the products.

At high specific humidity values, greater than approximately 18 g/kg, NFLUX and NOGAPS show very different patterns. NOGAPS displays a capping effect, similar to that seen with air temperature. The majority of NOGAPS observations remain lower than 20 g/kg while the *in situ* observations reach 25 g/kg, which causes a dry bias. NFLUX does not show the same capping effect that is seen with NOGAPS. Instead, NFLUX displays a more one-to-one relationship at high specific humidity values; however, the spread for NFLUX observations becomes larger as the specific humidity increases. This causes a larger standard deviation, which reduces the correlation, as seen in Table 5.

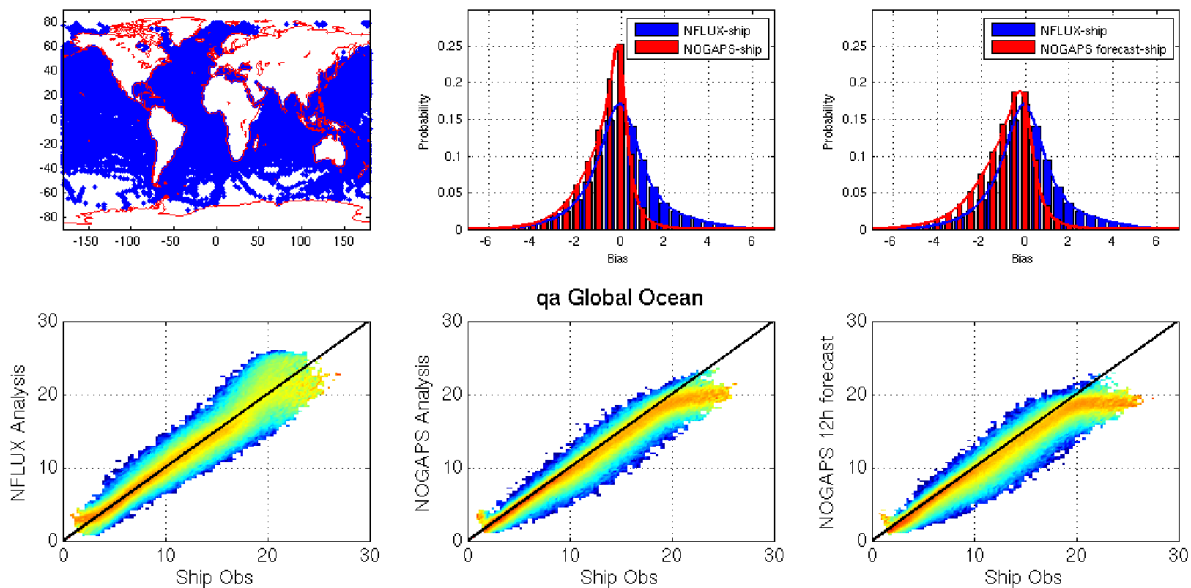


Figure 13: Specific humidity over global open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The top middle (right) panel shows a histogram of the probability of the mean bias of NFLUX analysis, shown in blue, and NOGAPS analysis (NOGAPS 12-hour forecast), shown in red. The bottom panels show scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right).

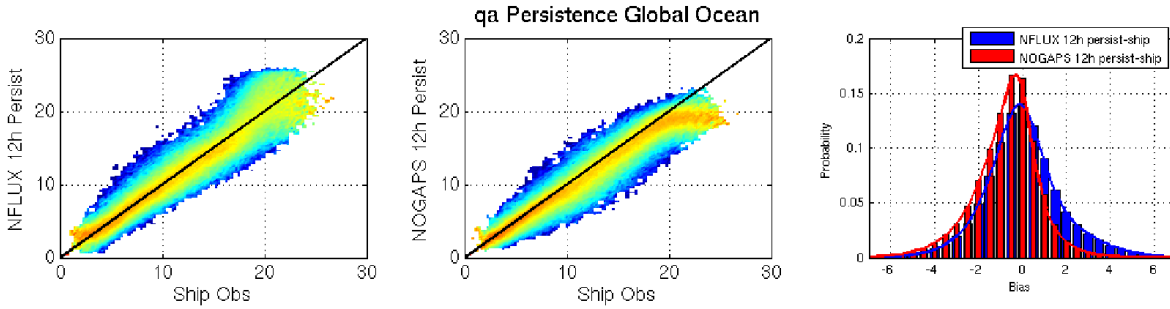


Figure 14: Specific humidity over global open ocean using unassimilated *in situ* data. The right panel shows a histogram of the probability of the mean bias of NFLUX analysis (blue) and NOGAPS analysis (red). Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (middle) are also shown.

3.2.1 Latitude Bands

Specific humidity open ocean matchups by latitude band are presented in Table 6, while the corresponding scatterplots using assimilated (unassimilated) observations are shown in Figure 15 (Figure 16). For both assimilated and unassimilated matchups, NFLUX has a lower mean bias than NOGAPS in all latitude bands except the 0°N to 15°N band. The NOGAPS analysis generally performs better in the remaining test statistics. The scatterplots show the large spread at high specific humidity values in most of the bands which increases the standard deviation and lowers the correlation for NFLUX. It is interesting to note that both NFLUX and NOGAPS have higher errors in the 0°N to 15°N band compared to the other bands; however, further investigation is required to know the reasons for the large errors.

Table 6: Specific humidity errors over the global open ocean by latitude band. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|---------------------|---------|-----------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Latitude 45 to 90 | | N = 83190 | | | | | | | |
| NFLUX Analysis | 0.0179 | 0.8733 | 0.8735 | 0.8502 | NFLUX 12h persist | 0.0069 | 1.1096 | 1.1096 | 0.7629 |
| NOGAPS Analysis | -0.2156 | 0.5965 | 0.6342 | 0.9206 | NOGAPS 12h persist | -0.2299 | 0.9791 | 1.0057 | 0.7940 |
| NOGAPS 12h fcst | -0.3067 | 0.7318 | 0.7935 | 0.8876 | | | | | |
| Latitude 30 to 45 | | N = 44823 | | | | | | | |
| NFLUX Analysis | -0.0902 | 1.4657 | 1.4685 | 0.8551 | NFLUX 12h persist | -0.0945 | 1.7844 | 1.7869 | 0.7898 |
| NOGAPS Analysis | -0.8509 | 1.2605 | 1.5208 | 0.8939 | NOGAPS 12h persist | -0.8897 | 1.7435 | 1.9573 | 0.8031 |
| NOGAPS 12h fcst | -1.0753 | 1.4394 | 1.7967 | 0.8651 | | | | | |
| Latitude 15 to 30 | | N = 52019 | | | | | | | |
| NFLUX Analysis | 0.1323 | 2.0152 | 2.0195 | 0.7462 | NFLUX 12h persist | 0.1393 | 2.2067 | 2.2111 | 0.7011 |
| NOGAPS Analysis | -0.8404 | 1.4717 | 1.6947 | 0.8561 | NOGAPS 12h persist | -0.8553 | 1.8350 | 2.0245 | 0.7818 |
| NOGAPS 12h fcst | -1.1262 | 1.6395 | 1.9891 | 0.8213 | | | | | |
| Latitude 0 to 15 | | N = 26083 | | | | | | | |
| NFLUX Analysis | 0.9710 | 3.2555 | 3.3972 | 0.2757 | NFLUX 12h persist | 1.0004 | 3.3328 | 3.4796 | 0.2554 |
| NOGAPS Analysis | -0.5892 | 2.8875 | 2.9469 | 0.3699 | NOGAPS 12h persist | -0.6016 | 3.0052 | 3.0648 | 0.3075 |
| NOGAPS 12h fcst | -0.9901 | 2.9898 | 3.1494 | 0.3197 | | | | | |
| Latitude -15 to 0 | | N = 11564 | | | | | | | |
| NFLUX Analysis | -0.0324 | 2.1353 | 2.1354 | 0.5448 | NFLUX 12h persist | -0.0037 | 2.2547 | 2.2546 | 0.5074 |
| NOGAPS Analysis | -1.3407 | 1.3110 | 1.8752 | 0.7518 | NOGAPS 12h persist | -1.3807 | 1.5600 | 2.0832 | 0.6490 |
| NOGAPS 12h fcst | -1.6351 | 1.5164 | 2.2300 | 0.6672 | | | | | |
| Latitude -90 to -15 | | N = 22512 | | | | | | | |
| NFLUX Analysis | -0.4088 | 1.4930 | 1.5479 | 0.8793 | NFLUX 12h persist | -0.4193 | 1.6772 | 1.7288 | 0.8489 |
| NOGAPS Analysis | -1.0187 | 1.2114 | 1.5828 | 0.9196 | NOGAPS 12h persist | -1.0669 | 1.5676 | 1.8962 | 0.8642 |
| NOGAPS 12h fcst | -1.2488 | 1.4248 | 1.8946 | 0.8880 | | | | | |

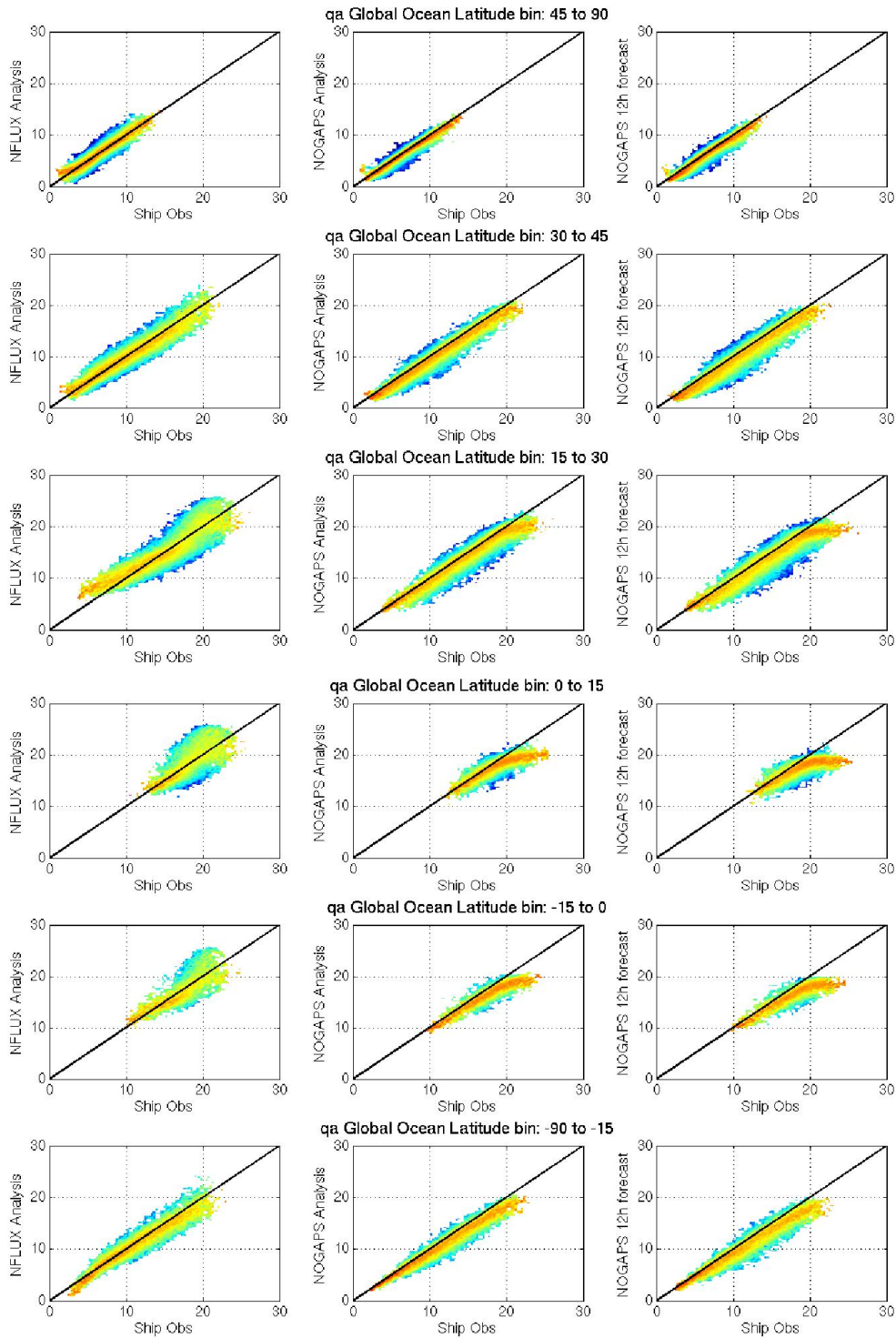


Figure 15: Specific humidity over global open ocean by latitude using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right) are shown.

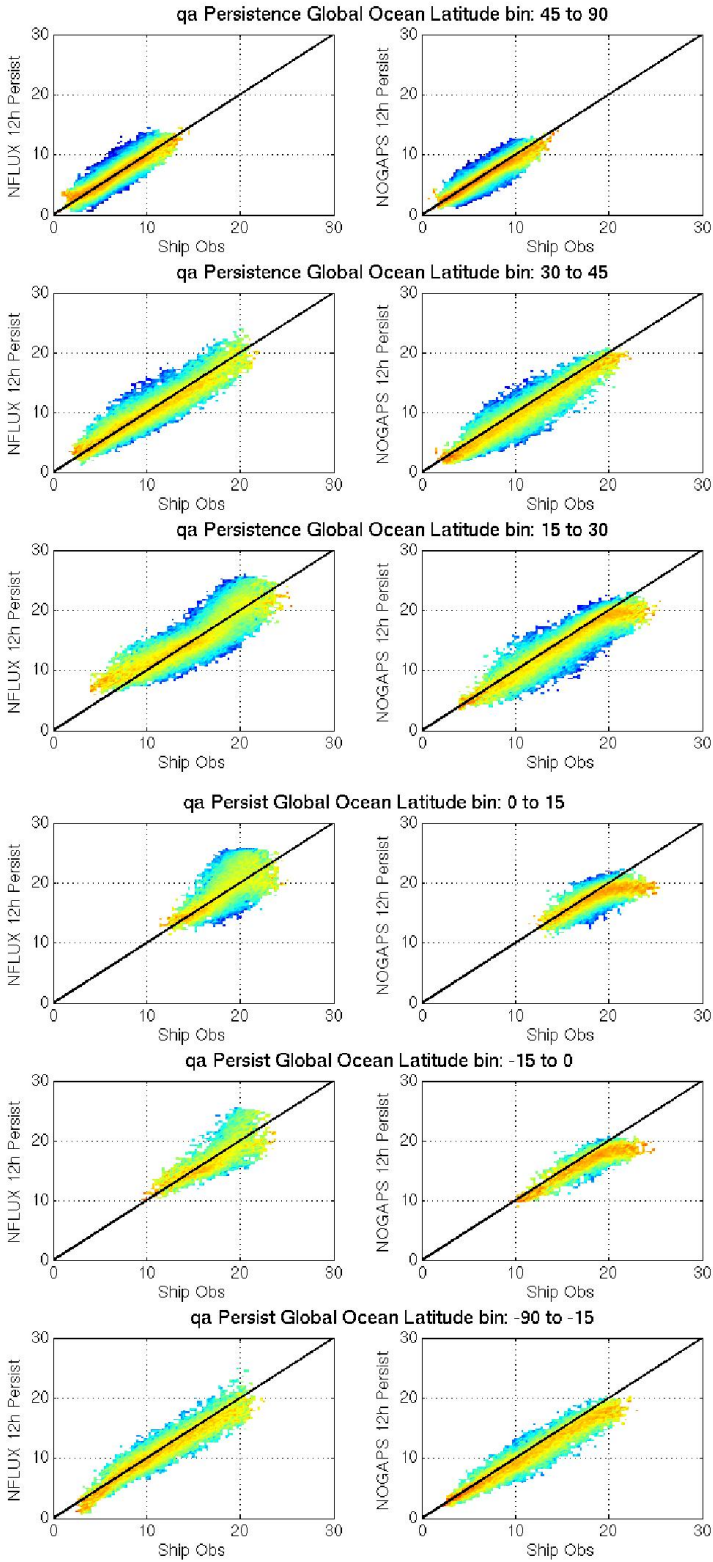


Figure 16: Specific humidity over global open ocean by latitude using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (right) are shown.

3.2.2 Seasonal

The open ocean specific humidity seasonal errors are shown in Table 7, with scatterplots using assimilated (unassimilated) observations shown in Figure 17 (Figure 18). The results are similar to those already presented. Using both assimilated and unassimilated observations, NFLUX shows a smaller mean bias compared to NOGAPS products. NOGAPS has smaller errors in the remaining test statistics. Although NOGAPS shows a capping effect at high specific humidity values, it also has less spread in the observations which results in a smaller standard deviation and higher correlation.

Table 7: Specific humidity errors over the global open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| DJF | | | | | N = 66699 | | | | |
| NFLUX Analysis | -0.0845 | 1.6961 | 1.6982 | 0.9097 | NFLUX 12h persist | -0.0881 | 1.8931 | 1.8952 | 0.8884 |
| NOGAPS Analysis | -0.7581 | 1.4446 | 1.6315 | 0.9341 | NOGAPS 12h persist | -0.7887 | 1.7682 | 1.9361 | 0.9001 |
| NOGAPS 12h fcst | -1.0065 | 1.5811 | 1.8743 | 0.9209 | | | | | |
| MAM | | | | | N = 52777 | | | | |
| NFLUX Analysis | -0.2045 | 1.7079 | 1.7201 | 0.9097 | NFLUX 12h persist | -0.2225 | 1.8795 | 1.8926 | 0.8915 |
| NOGAPS Analysis | -0.5734 | 1.4371 | 1.5472 | 0.9355 | NOGAPS 12h persist | -0.6062 | 1.7086 | 1.8129 | 0.9076 |
| NOGAPS 12h fcst | -0.7760 | 1.5806 | 1.7608 | 0.9228 | | | | | |
| JJA | | | | | N = 56326 | | | | |
| NFLUX Analysis | 0.3949 | 1.8451 | 1.8869 | 0.8898 | NFLUX 12h persist | 0.3971 | 1.9805 | 2.0199 | 0.8742 |
| NOGAPS Analysis | -0.4776 | 1.4325 | 1.5100 | 0.9280 | NOGAPS 12h persist | -0.5010 | 1.6789 | 1.7521 | 0.9004 |
| NOGAPS 12h fcst | -0.6567 | 1.5804 | 1.7114 | 0.9133 | | | | | |
| SON | | | | | N = 64389 | | | | |
| NFLUX Analysis | 0.2215 | 1.8808 | 1.8938 | 0.8882 | NFLUX 12h persist | 0.2399 | 2.0839 | 2.0977 | 0.8640 |
| NOGAPS Analysis | -0.7124 | 1.5013 | 1.6618 | 0.9239 | NOGAPS 12h persist | -0.7199 | 1.8292 | 1.9658 | 0.8861 |
| NOGAPS 12h fcst | -0.9329 | 1.6764 | 1.9185 | 0.9049 | | | | | |

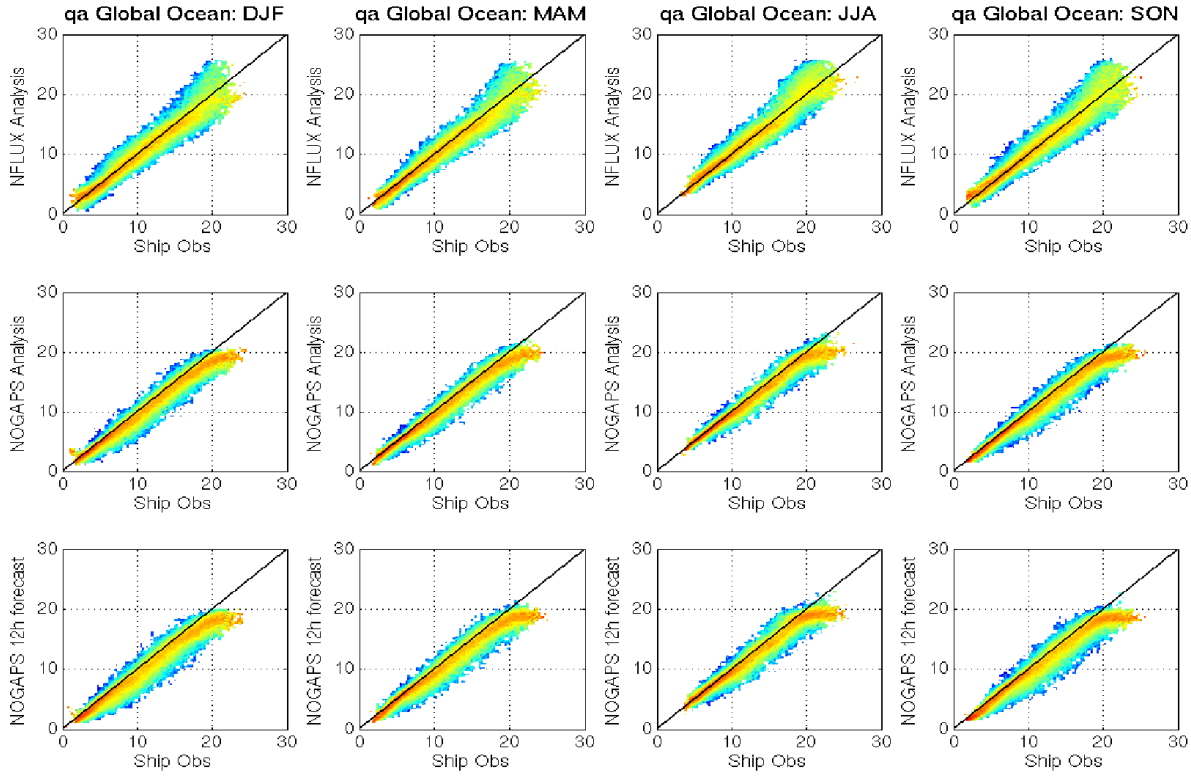


Figure 17: Specific humidity over global open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (bottom) are shown.

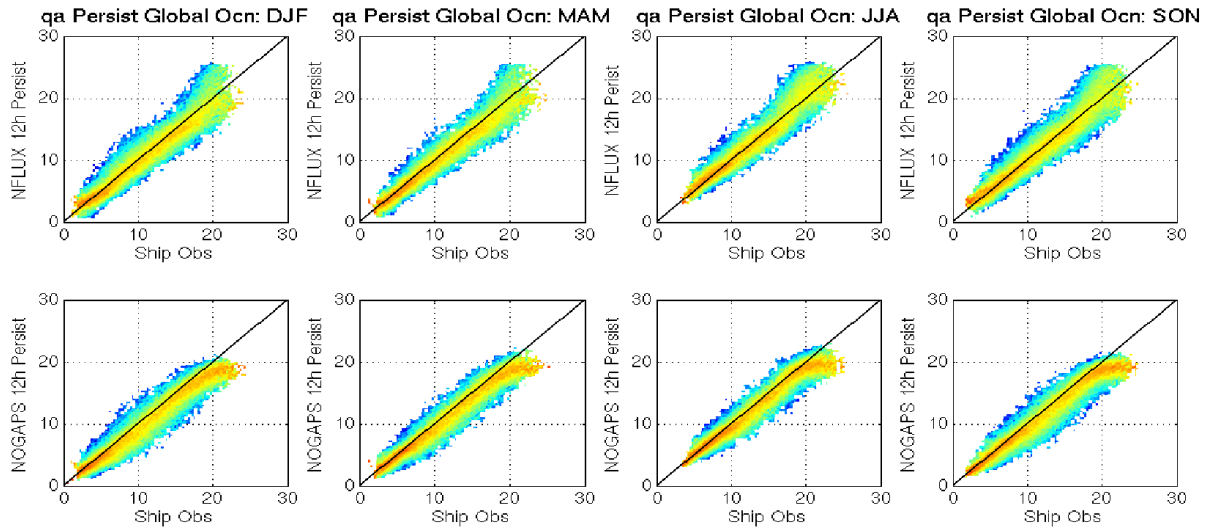


Figure 18: Specific humidity over global open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top) and NOGAPS analysis (bottom) are shown.

3.3 Wind Speed Results

Figure 19 shows mean wind speed error using unassimilated *in situ* observations of the NFLUX analyses (top) and the NOGAPS analyses (bottom) over the full 2 year data set. The wind speed error has a more random spatial pattern than either air temperature or specific humidity. In general, NFLUX shows a high wind speed bias in the north Atlantic and western Pacific and a slight low wind speed bias in the eastern Pacific. NOGAPS shows an overall low wind speed bias, with the largest differences in the eastern tropical Atlantic and north Pacific.

Figure 20 shows the global 2-year annual wind speed difference between NFLUX and NOGAPS analysis fields (left), with the zonal average of the difference (right). NFLUX shows stronger wind speeds globally compared to NOGAPS, which follows from NOGAPS showing an overall low wind speed bias from Figure 19. Also to note from Figure 20 is the large difference along much of the coastlines. This is due to NOGAPS having a coarser resolution than NFLUX and the relatively smooth topography along the coast.

Wind speed errors using assimilated and unassimilated *in situ* matchups are presented in Table 8. In the open ocean using assimilated and unassimilated matchups, NFLUX shows a smaller mean bias compared to NOGAPS. NOGAPS analysis (NOGAPS 12-hour forecast) shows smaller (larger) errors for the remaining test statistics except for the RMS using unassimilated matchups. Each of the means and standard deviations are significantly different at the 95% confidence interval.

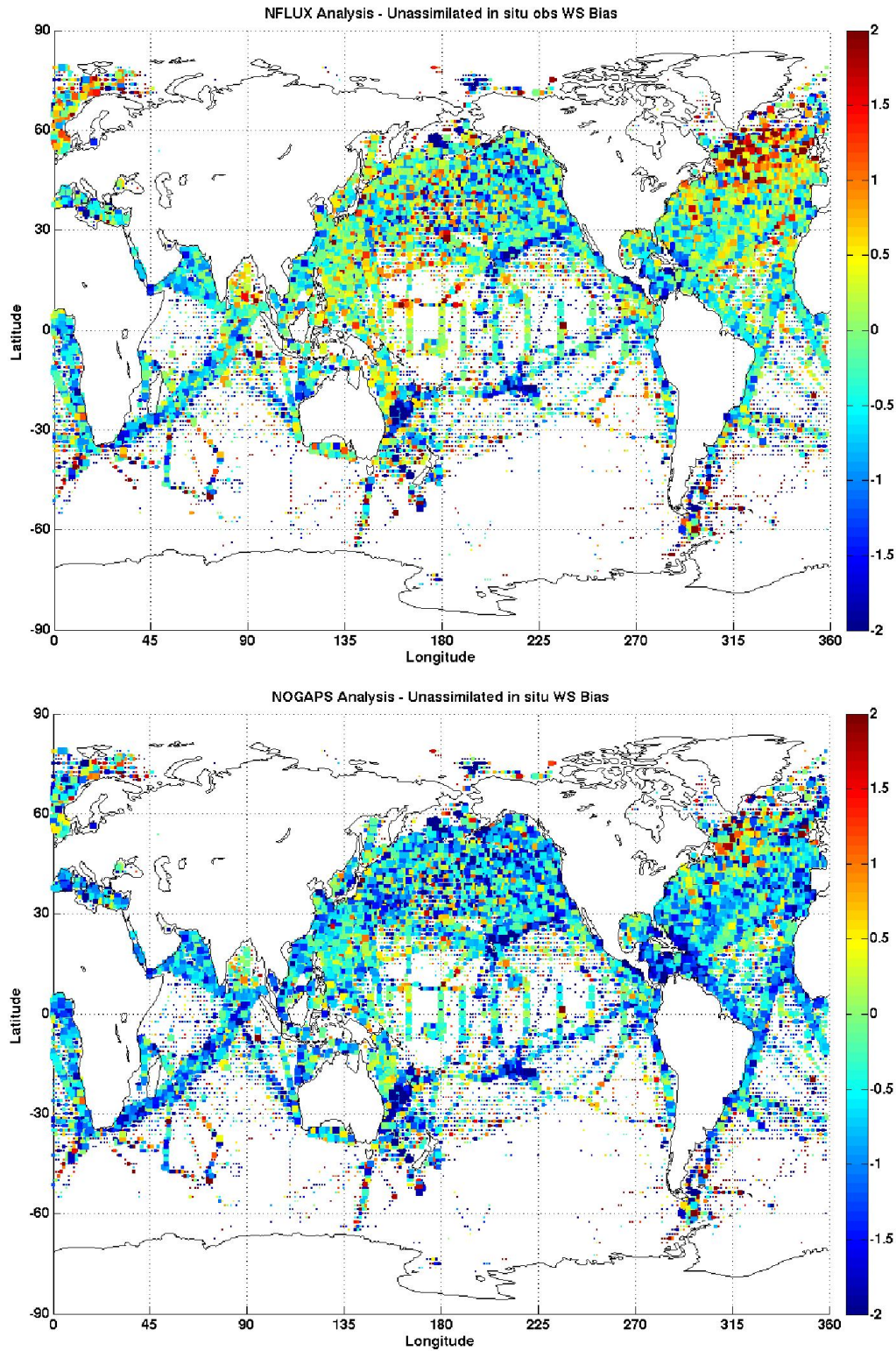


Figure 19: Global 2-year average wind speed bias (m/s). The NFLUX (NOGAPS) bias compared to unassimilated observations is shown in the top (bottom) panel. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

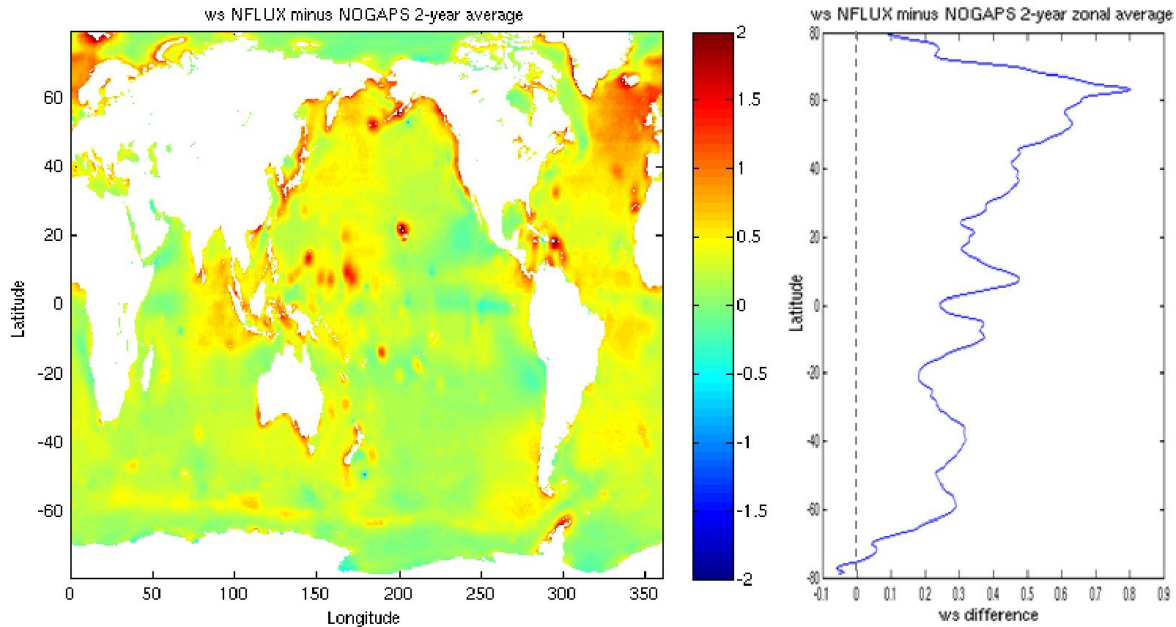


Figure 20: Global 2-year average NFLUX minus NOGAPS wind speed difference (m/s). The left panel shows the global gridded difference. The right panel shows the zonally averaged difference.

Table 8: Wind speed errors over the global ocean. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (global), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| Global N = 763868 | | | | | | | | | |
| NFLUX Analysis | -0.1490 | 2.2148 | 2.2198 | 0.6281 | NFLUX 12h persist | -0.1526 | 3.1379 | 3.1416 | 0.3297 |
| NOGAPS Analysis | -0.6784 | 2.1934 | 2.2959 | 0.6348 | NOGAPS 12h persist | -0.6826 | *3.1399 | 3.2132 | 0.3282 |
| NOGAPS 12h fcst | -0.5417 | 2.3316 | 2.3936 | 0.5967 | | | | | |
| Coastal N = 343507 | | | | | | | | | |
| NFLUX Analysis | -0.3360 | 2.4126 | 2.4359 | 0.5927 | NFLUX 12h persist | -0.3409 | 3.3506 | 3.3679 | 0.2962 |
| NOGAPS Analysis | -0.9441 | *2.4202 | 2.5978 | 0.5884 | NOGAPS 12h persist | -0.9473 | *3.3656 | 3.4964 | 0.2854 |
| NOGAPS 12h fcst | -0.7220 | 2.5515 | 2.6517 | 0.5536 | | | | | |
| Ocean N = 420361 | | | | | | | | | |
| NFLUX Analysis | 0.0038 | 2.0263 | 2.0263 | 0.6569 | NFLUX 12h persist | 0.0012 | 2.9437 | 2.9437 | 0.3479 |
| NOGAPS Analysis | -0.4612 | 1.9624 | 2.0159 | 0.6776 | NOGAPS 12h persist | -0.4663 | 2.9249 | 2.9618 | 0.3556 |
| NOGAPS 12h fcst | -0.3944 | 2.1237 | 2.1600 | 0.6310 | | | | | |

Scatterplots of NFLUX and NOGAPS wind speed versus assimilated (unassimilated) *in situ* observations, as well as corresponding histograms of the probability of the mean bias, are shown in Figure 21 (Figure 22). Unlike the scatterplots shown for air temperature and specific humidity which showed a relatively close one-to-one relationship, both NFLUX and NOGAPS show a very large spread in wind speed, with the unassimilated matchups being broader than the assimilated matchups. At low wind speeds, NFLUX and NOGAPS both show a high bias. At high wind speeds, both NFLUX and NOGAPS show a low bias.

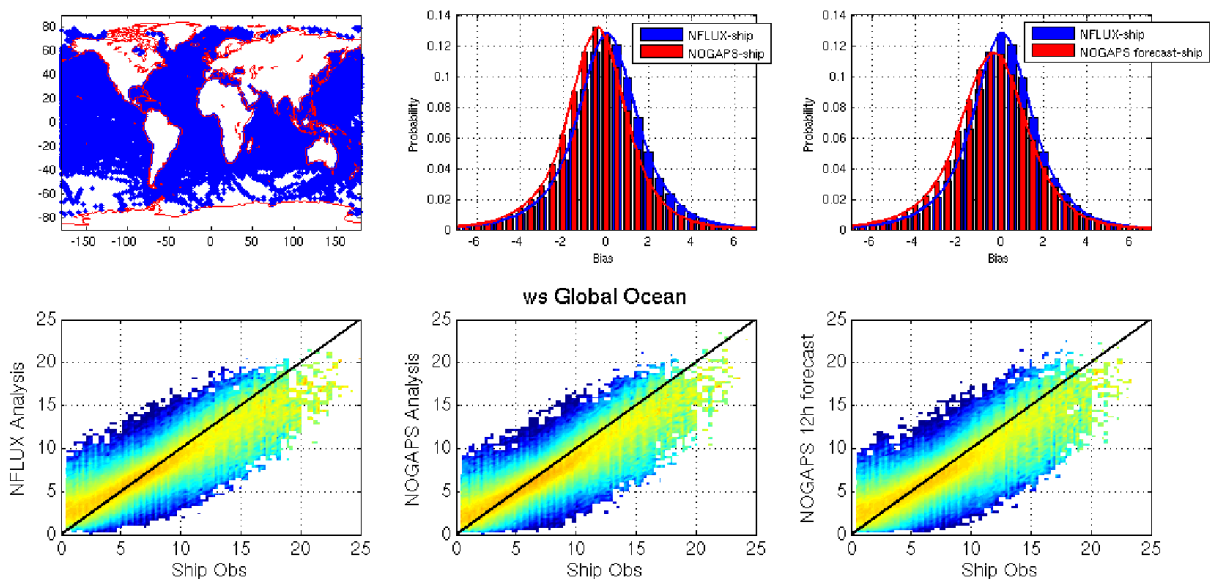


Figure 21: Wind speed over global open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The top middle (right) panel shows a histogram of the probability of the mean bias of NFLUX analysis, shown in blue, and NOGAPS analysis (NOGAPS 12-hour forecast), shown in red. The bottom panels show scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right).

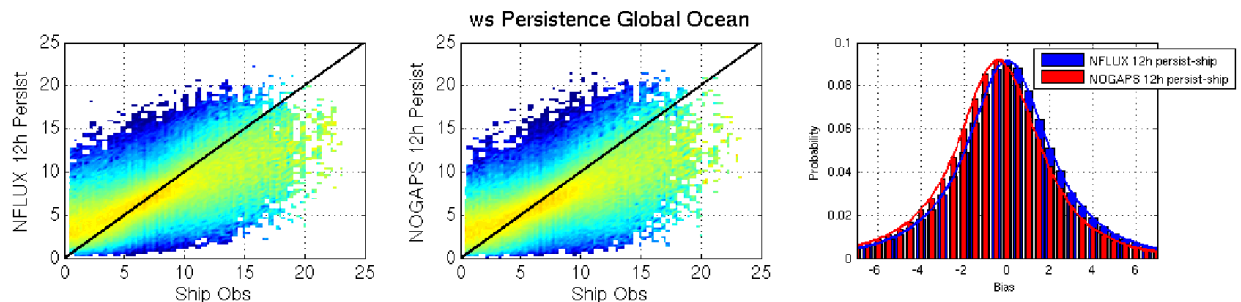


Figure 22: Wind speed over global open ocean using unassimilated *in situ* data. The right panel shows a histogram of the probability of the mean bias of NFLUX analysis (blue) and NOGAPS analysis (red). Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (middle) are also shown.

3.3.1 Latitude Bands

The open ocean wind speed results by latitude band are shown in Table 9. The corresponding scatterplots using assimilated (unassimilated) *in situ* observations shown in Figure 23 (Figure 24). NFLUX has a lower mean bias than NOGAPS in all latitude bands with both assimilated and unassimilated matchups, except for the 45°N to 90°N latitude band using assimilated matchups.

Using assimilated matchups, NFLUX has smaller errors in the remaining test statistics compared to NOGAPS in the tropics, the 15°S to 15°N latitude bands. As seen with the scatterplots (Figure 23), these two latitude bands have wind speeds less than approximately 13 m/s which reduces the low wind speed bias at high wind speeds. In the 15°N to 45°N latitude bands, NFLUX shows a smaller RMS than NOGAPS; however, the NOGAPS analysis has a smaller standard deviation and higher correlation. In the remaining latitude bands, 90°S to 15°S and 45°N to 90°N, the NOGAPS analysis has smaller errors in the remaining test statistics.

Using unassimilated matchups, NFLUX shows improvement over NOGAPS over an extended area, from 15°S to 45°N. Similar to using assimilated matchups, the two poleward latitude bands, 90°S to 15°S and 45°N to 90°N, NOGAPS has smaller errors in the remaining test statistics.

Table 9: Wind speed errors over the global open ocean by latitude band. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|---------------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| Latitude 45 to 90 | | | | | N = 104128 | | | | |
| NFLUX Analysis | 0.2701 | 2.2794 | 2.2953 | 0.7058 | NFLUX 12h persist | 0.2755 | 3.8758 | 3.8855 | 0.2695 |
| NOGAPS Analysis | -0.3639 | 2.0971 | 2.1284 | 0.7511 | NOGAPS 12h persist | -0.3638 | 3.8065 | 3.8238 | 0.2985 |
| NOGAPS 12h fcst | -0.1356 | *2.2912 | 2.2952 | 0.7085 | | | | | |
| Latitude 30 to 45 | | | | | N = 64699 | | | | |
| NFLUX Analysis | -0.0601 | 2.3923 | 2.3930 | 0.6203 | NFLUX 12h persist | -0.0658 | 3.6225 | 3.6230 | 0.2534 |
| NOGAPS Analysis | -0.5455 | 2.3577 | 2.4200 | 0.6331 | NOGAPS 12h persist | -0.5551 | *3.6296 | 3.6718 | 0.2583 |
| NOGAPS 12h fcst | -0.4678 | 2.5015 | 2.5449 | 0.5955 | | | | | |
| Latitude 15 to 30 | | | | | N = 73890 | | | | |
| NFLUX Analysis | -0.0945 | 1.8720 | 1.8743 | 0.6179 | NFLUX 12h persist | -0.1002 | 2.4621 | 2.4641 | 0.3814 |
| NOGAPS Analysis | -0.5232 | 1.8504 | 1.9229 | 0.6263 | NOGAPS 12h persist | -0.5311 | 2.4933 | 2.5492 | 0.3688 |
| NOGAPS 12h fcst | -0.4356 | 1.9849 | 2.0321 | 0.5746 | | | | | |
| Latitude 0 to 15 | | | | | N = 86531 | | | | |
| NFLUX Analysis | -0.0095 | 1.7412 | 1.7412 | 0.5511 | NFLUX 12h persist | -0.0180 | 1.9834 | 1.9835 | 0.4348 |
| NOGAPS Analysis | -0.4163 | 1.7692 | 1.8175 | 0.5384 | NOGAPS 12h persist | -0.4241 | 2.0096 | 2.0539 | 0.4229 |
| NOGAPS 12h fcst | -0.4968 | 1.9249 | 1.9880 | 0.4674 | | | | | |
| Latitude -15 to 0 | | | | | N = 65060 | | | | |
| NFLUX Analysis | -0.0486 | 1.4708 | 1.4716 | 0.5694 | NFLUX 12h persist | -0.0517 | 1.6984 | 1.6992 | 0.4450 |
| NOGAPS Analysis | -0.4157 | 1.4947 | 1.5514 | 0.5560 | NOGAPS 12h persist | -0.4180 | 1.7180 | 1.7681 | 0.4326 |
| NOGAPS 12h fcst | -0.4236 | 1.6433 | 1.6970 | 0.4802 | | | | | |
| Latitude -90 to -15 | | | | | N = 26053 | | | | |
| NFLUX Analysis | -0.4486 | 2.3076 | 2.3507 | 0.5475 | NFLUX 12h persist | -0.4445 | 3.0303 | 3.0627 | 0.2877 |
| NOGAPS Analysis | -0.7270 | 2.2183 | 2.3343 | 0.5793 | NOGAPS 12h persist | -0.7322 | 2.9724 | 3.0612 | 0.3043 |
| NOGAPS 12h fcst | -0.7155 | 2.3662 | 2.4720 | 0.5281 | | | | | |

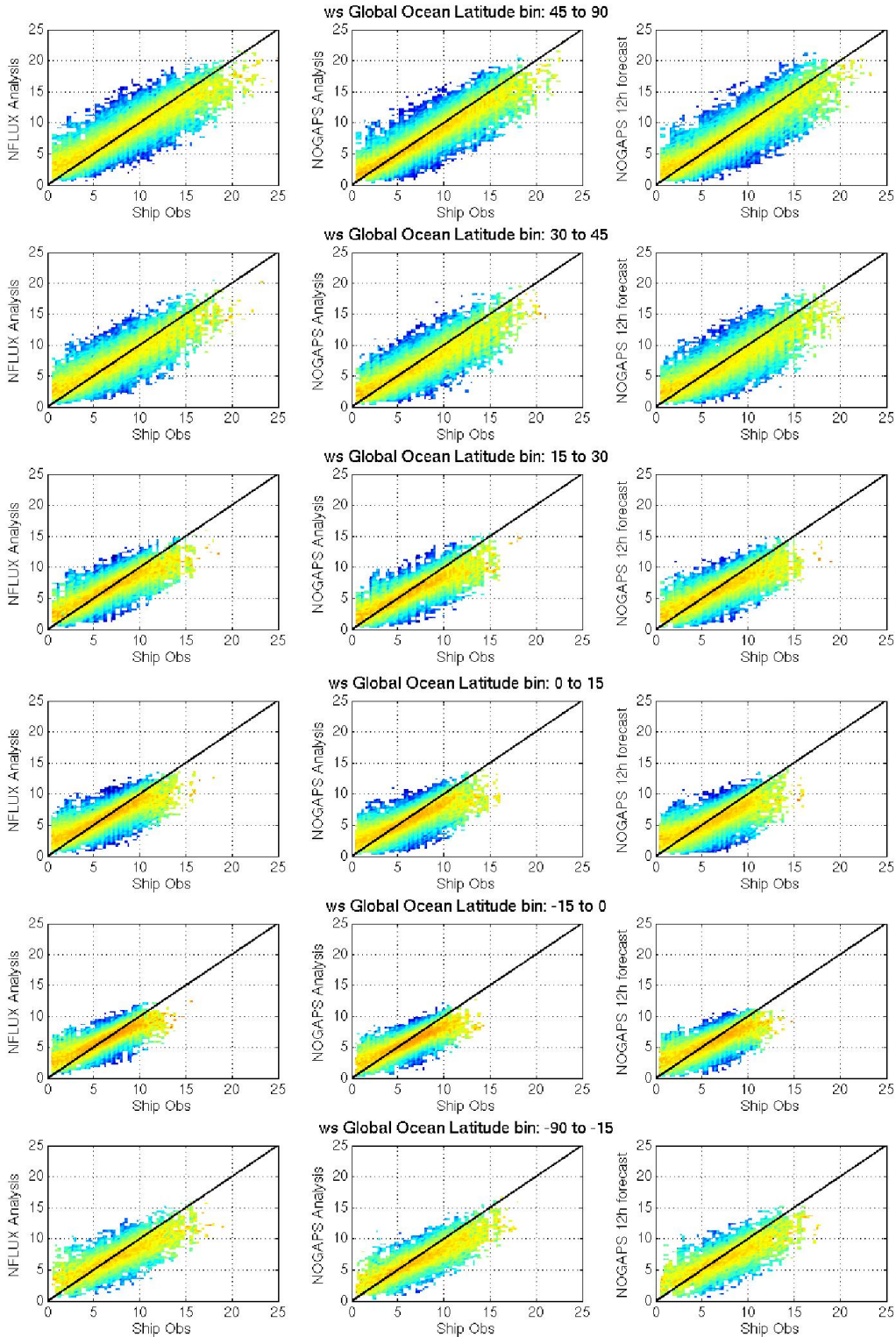


Figure 23: Wind speed over global open ocean by latitude using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (right) are shown.

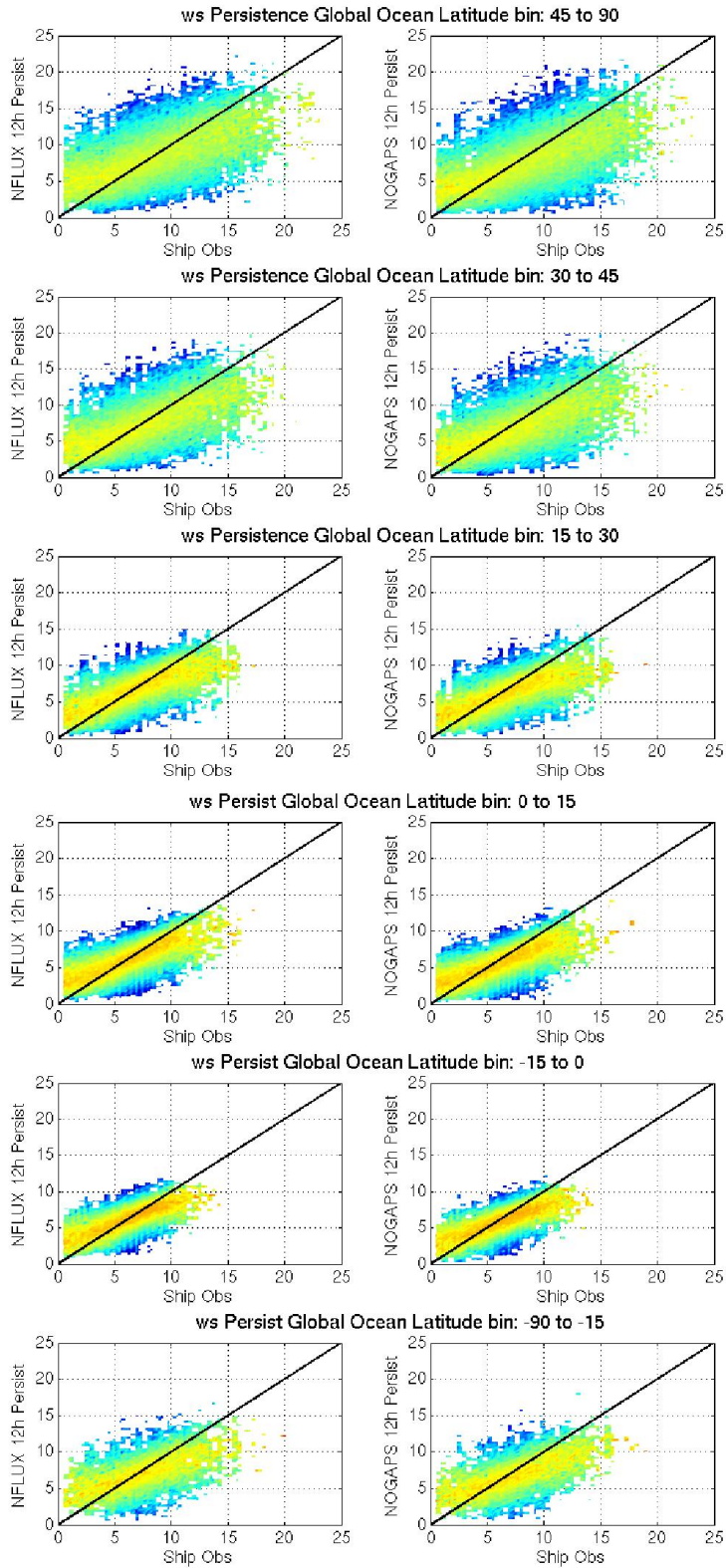


Figure 24: Wind speed over global open ocean by latitude using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left) and NOGAPS analysis (right) are shown.

3.3.2 Seasonal

The open ocean wind speed results by season are shown in Table 10, with the corresponding scatterplots using assimilated (unassimilated) *in situ* observations shown in Figure 25 (Figure 26). As seen with the latitude banding, NFLUX has improved skill over each of the NOGAPS products for the mean bias in each season. Using assimilated matchups, the NOGAPS analysis has reduced errors in the remaining test statistics than NFLUX; however, NFLUX does show improvement over the NOGAPS 12-hour forecasts. Using the unassimilated matchups, the DJF and MAM seasons do not have significantly different standard deviations at the 95% confidence interval. NFLUX shows a smaller RMS in each season than NOGAPS; however, NOGAPS has smaller standard deviations and larger correlations than NFLUX.

Table 10: Wind speed errors over the global open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-------------------|---------|--------|--------|----------------|--------------------|---------|---------|--------|----------------|
| DJF N = 112196 | | | | | | | | | |
| NFLUX Analysis | 0.0181 | 2.1997 | 2.1998 | 0.6679 | NFLUX 12h persist | 0.0178 | 3.2857 | 3.2857 | 0.3385 |
| NOGAPS Analysis | -0.4684 | 2.1365 | 2.1872 | 0.6869 | NOGAPS 12h persist | -0.4711 | *3.2778 | 3.3115 | 0.3442 |
| NOGAPS 12h fcst | -0.3886 | 2.2939 | 2.3266 | 0.6469 | | | | | |
| MAM N = 94957 | | | | | | | | | |
| NFLUX Analysis | 0.0105 | 1.9885 | 1.9885 | 0.6389 | NFLUX 12h persist | 0.0061 | 2.8659 | 2.8659 | 0.3300 |
| NOGAPS Analysis | -0.4398 | 1.9325 | 1.9819 | 0.6570 | NOGAPS 12h persist | -0.4467 | *2.8483 | 2.8831 | 0.3329 |
| NOGAPS 12h fcst | -0.3724 | 2.0938 | 2.1266 | 0.6066 | | | | | |
| JJA N = 102180 | | | | | | | | | |
| NFLUX Analysis | 0.0086 | 1.8615 | 1.8615 | 0.6072 | NFLUX 12h persist | 0.0052 | 2.5633 | 2.5633 | 0.3223 |
| NOGAPS Analysis | -0.4375 | 1.8003 | 1.8527 | 0.6317 | NOGAPS 12h persist | -0.4417 | 2.5316 | 2.5698 | 0.3367 |
| NOGAPS 12h fcst | -0.3965 | 1.9632 | 2.0028 | 0.5708 | | | | | |
| SON N = 111028 | | | | | | | | | |
| NFLUX Analysis | -0.0209 | 2.0207 | 2.0208 | 0.6681 | NFLUX 12h persist | -0.0233 | 2.9710 | 2.9710 | 0.3537 |
| NOGAPS Analysis | -0.4939 | 1.9466 | 2.0083 | 0.6920 | NOGAPS 12h persist | -0.5009 | 2.9485 | 2.9907 | 0.3648 |
| NOGAPS 12h fcst | -0.4170 | 2.1122 | 2.1529 | 0.6470 | | | | | |

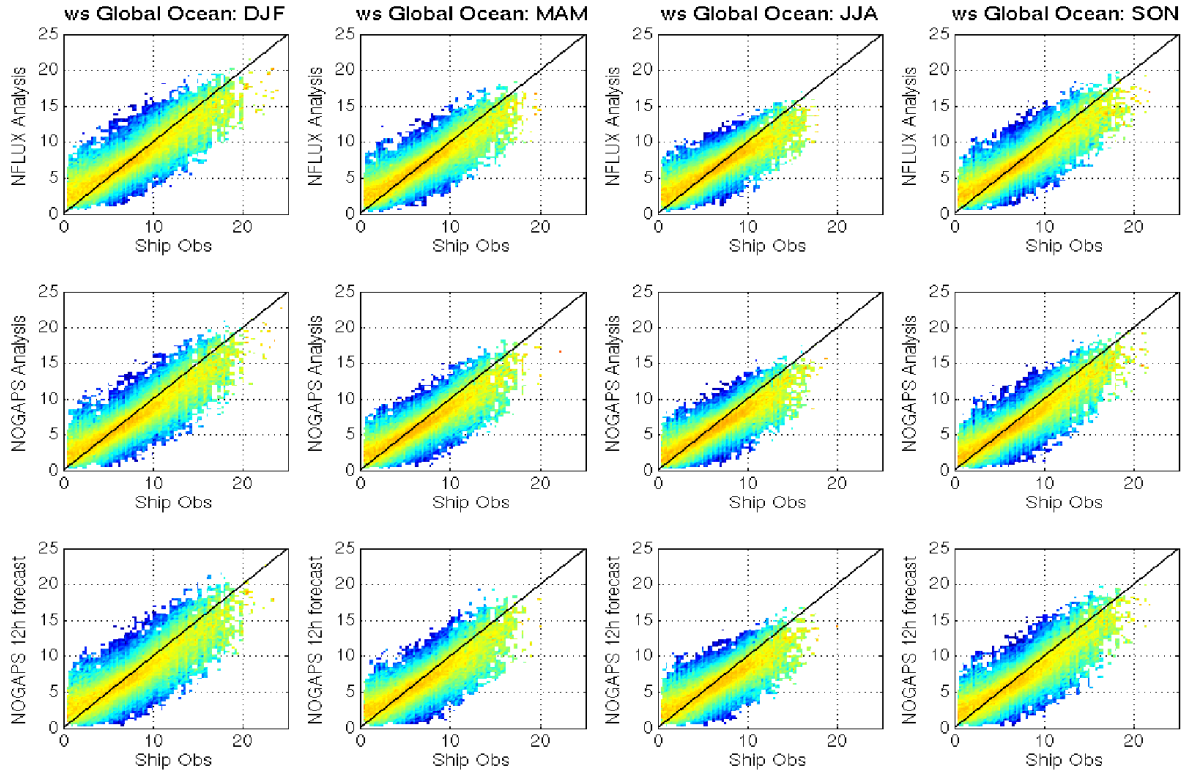


Figure 25: Wind speed over global open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top), NOGAPS analysis (middle), and NOGAPS 12-hour forecast (bottom) are shown.

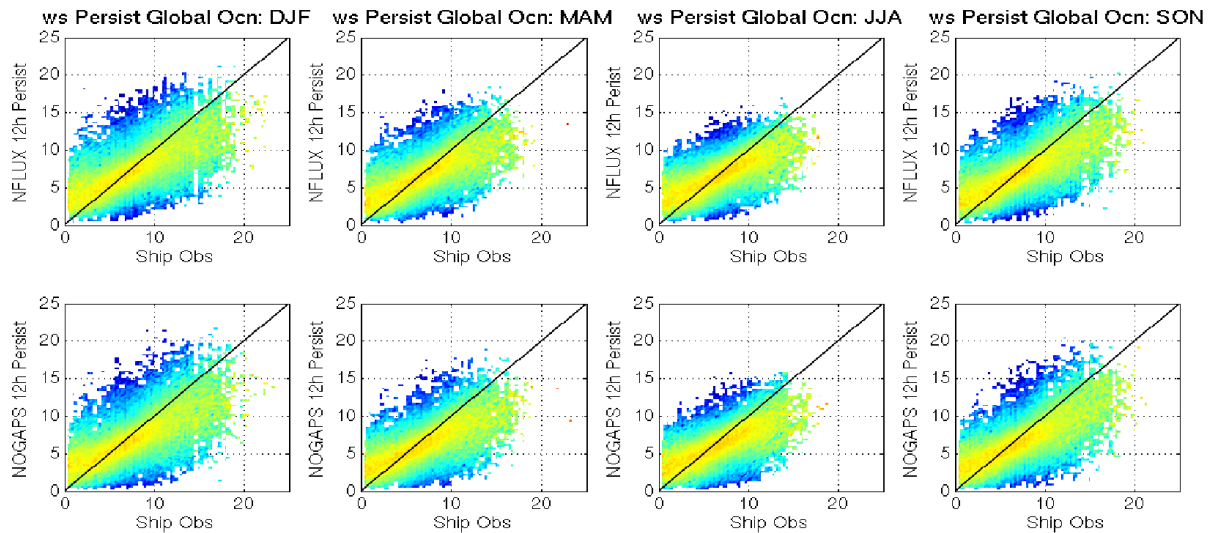


Figure 26: Wind speed over global open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top) and NOGAPS analysis (bottom) are shown.

4.0 TEST CASE 2: EASTERN PACIFIC

The eastern Pacific domain spans from 160°-114°W and 29°-60°N with a horizontal resolution of .2 degrees. The grid has 231 x 156 grid points. The NFLUX grid domain and resolution matches the eastern Pacific COAMPS domain. The COAMPS 12-hour forecast is blended with the previous NFLUX correction field to generate the background field for the NFLUX analysis. NFLUX analysis performance is compared against both the eastern Pacific COAMPS analysis and 12-hour forecast fields, as well as the global NOGAPS analysis and 12-hour forecast fields over the eastern Pacific. Validation statistics are calculated for both the assimilated and unassimilated *in situ* matchup data.

4.1 Air Temperature Results

Figure 27 shows mean air temperature error over the eastern Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left). Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared with the *in situ* matchups, both NFLUX and NOGAPS show near neutral to slightly cold biases. Therefore, the annual difference between NFLUX and NOGAPS shows very little change, with the exception of the west coast of Mexico. In this area NFLUX is warmer than NOGAPS. Unlike NFLUX or NOGAPS, COAMPS shows a very noticeable cold bias throughout the entire region compared to the *in situ* observations. This causes NFLUX to be significantly warmer than COAMPS in the annual comparison of the two systems. Similar to the comparison between NFLUX and NOGAPS, the differences between NFLUX and COAMPS are greatest off the west coast of Mexico.

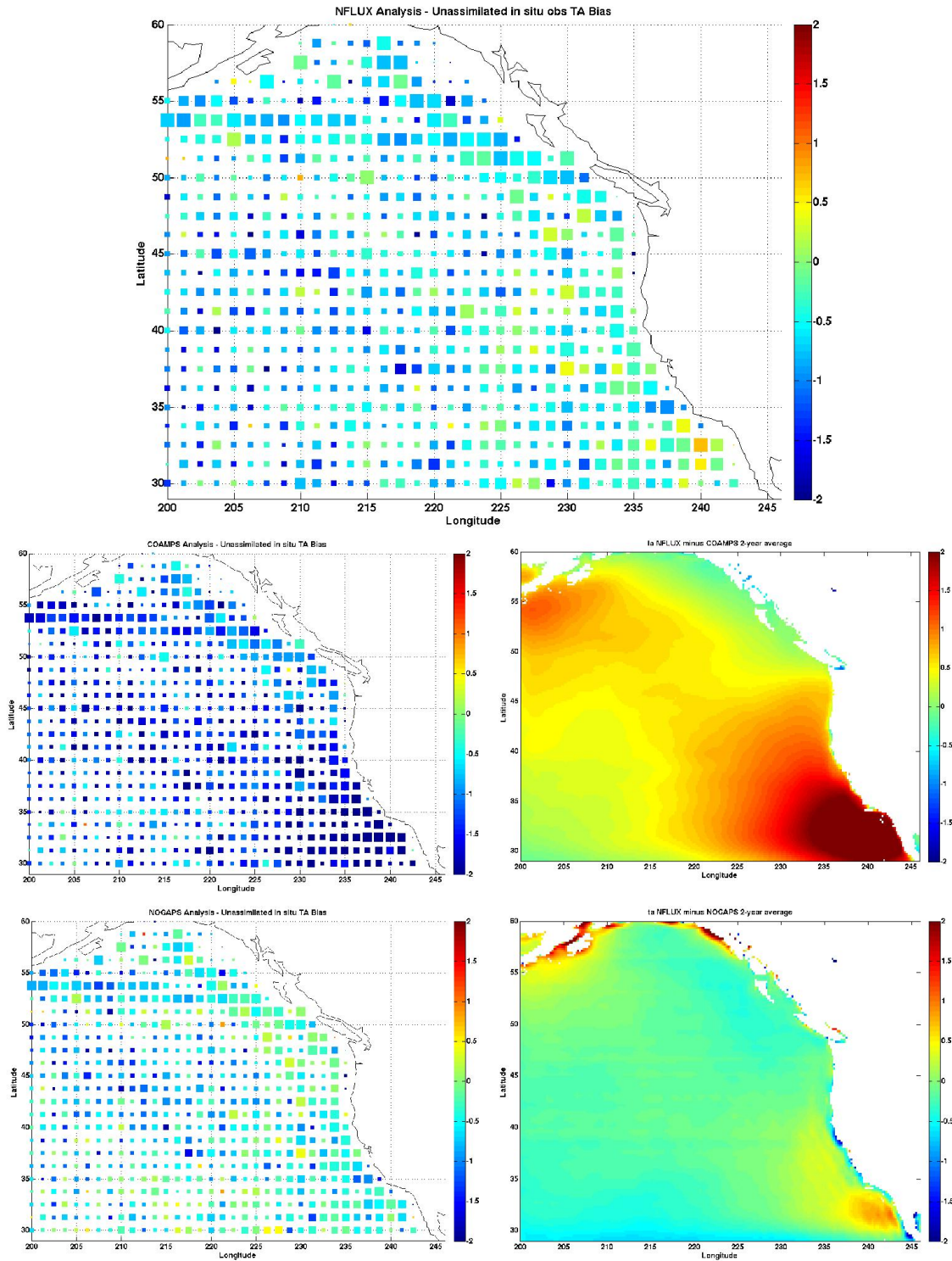


Figure 27: Eastern Pacific 2-year average air temperature bias (°C). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

Test statistics are calculated for the eastern Pacific region (Table 11) using assimilated (left column) and unassimilated (right column) *in situ* matchup observations. For the open ocean using assimilated matchups, NFLUX shows improvement over COAMPS; however, NOGAPS shows smaller errors than NFLUX. Using unassimilated matchups, NFLUX shows improvement over both COAMPS and NOGAPS in each test statistic except for the mean bias.

Table 11: Air temperature errors over the eastern Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|---------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Regional N = 92425 | | | | | | | | | |
| NFLUX Analysis | -0.1157 | 1.4696 | 1.4741 | 0.8844 | NFLUX 12h persist | -0.1189 | 1.9201 | 1.9237 | 0.8053 |
| COAMPS Analysis | -0.6729 | 2.0463 | 2.1541 | 0.7810 | COAMPS 12h persist | -0.6670 | 2.3782 | 2.4700 | 0.7101 |
| COAMPS 12h fcst | -0.5566 | 1.8236 | 1.9067 | 0.8275 | NOGAPS 12h persist | 0.0311 | 2.3897 | 2.3899 | 0.7389 |
| NOGAPS Analysis | 0.0176 | 1.9761 | 1.9761 | 0.8226 | | | | | |
| NOGAPS 12h fcst | 0.1667 | 1.9903 | 1.9972 | 0.8204 | | | | | |
| Coastal N = 61765 | | | | | | | | | |
| NFLUX Analysis | -0.0543 | 1.5927 | 1.5936 | 0.8483 | NFLUX 12h persist | -0.0512 | 2.1467 | 2.1472 | 0.7260 |
| COAMPS Analysis | -0.5083 | 2.2381 | 2.2951 | 0.7110 | COAMPS 12h persist | -0.4987 | 2.6312 | 2.6780 | 0.6085 |
| COAMPS 12h fcst | -0.4046 | 2.0348 | 2.0746 | 0.7724 | NOGAPS 12h persist | 0.1309 | 2.7469 | 2.7500 | 0.6525 |
| NOGAPS Analysis | 0.1087 | 2.2681 | 2.2707 | 0.7728 | | | | | |
| NOGAPS 12h fcst | 0.2999 | 2.2871 | 2.3067 | 0.7695 | | | | | |
| Ocean N = 30660 | | | | | | | | | |
| NFLUX Analysis | -0.2392 | 1.1734 | 1.1975 | 0.9413 | NFLUX 12h persist | -0.2551 | 1.3427 | 1.3667 | 0.9235 |
| COAMPS Analysis | -1.0045 | 1.5386 | 1.8375 | 0.8989 | COAMPS 12h persist | -1.0061 | 1.7122 | 1.9859 | 0.8757 |
| COAMPS 12h fcst | -0.8628 | 1.2426 | 1.5127 | 0.9334 | NOGAPS 12h persist | -0.1701 | 1.3980 | 1.4083 | 0.9164 |
| NOGAPS Analysis | -0.1660 | *1.1653 | 1.1770 | 0.9416 | | | | | |
| NOGAPS 12h fcst | -0.1016 | 1.1383 | 1.1428 | 0.9442 | | | | | |

Open ocean air temperature scatterplots of the assimilated (unassimilated) *in situ* observations are shown in the left (bottom) panels of Figure 28 (Figure 29), with the corresponding comparison of the probability of the mean bias in the right (top) panels. The global air temperature test case revealed a capping effect at very high temperatures, above approximately 28°C. NFLUX also showed a slight warm bias at low temperatures, below approximately 4°C.

Unlike the global ocean, air temperature in the eastern Pacific generally remains below 25°C; therefore, the issue at high temperatures is not seen here. The slight warm bias at low temperatures is still present in NFLUX. This feature is not seen in the COAMPS / NOGAPS products. The close linear relationship between the models and *in situ* observations is seen here; however, COAMPS shows a shift in the one-to-one relationship to reveal a consistent cold bias.

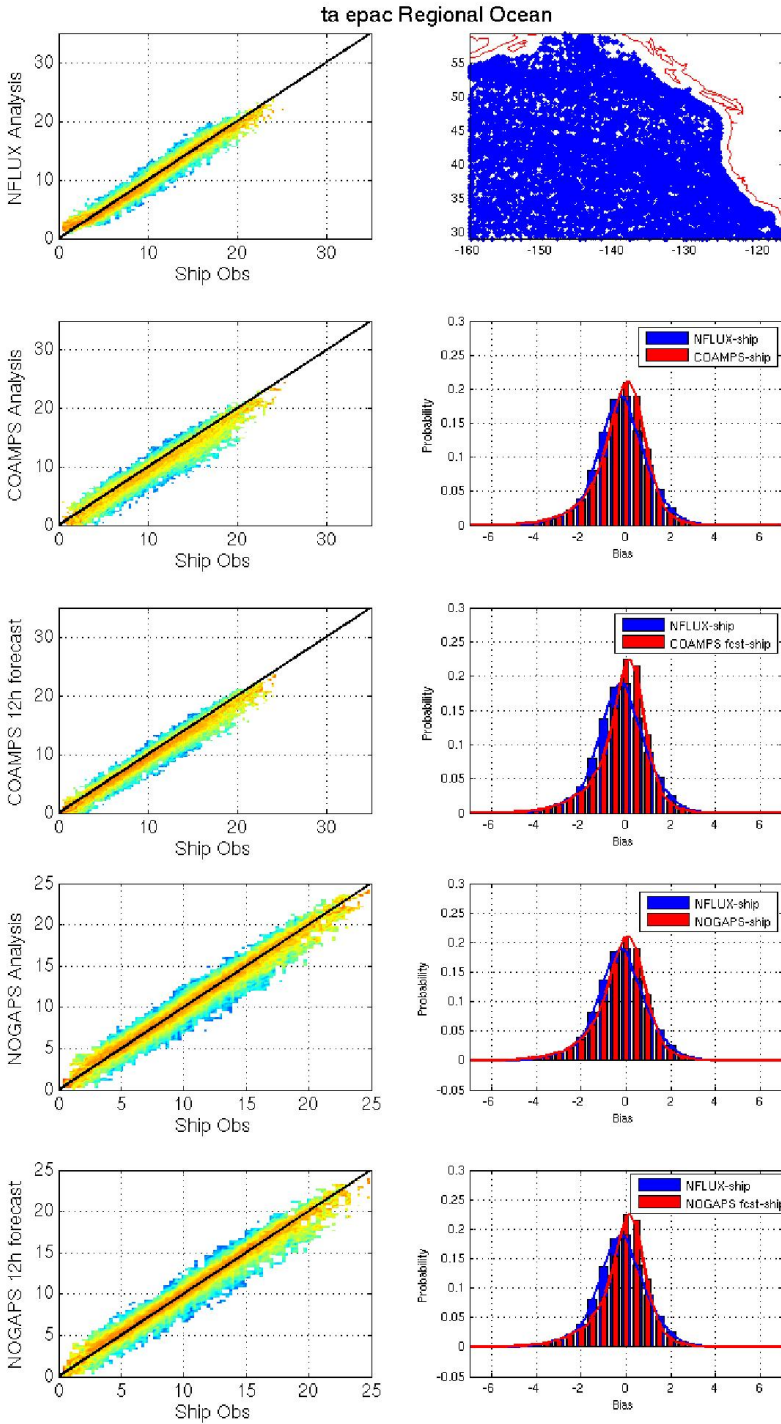


Figure 28: Air temperature over eastern Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

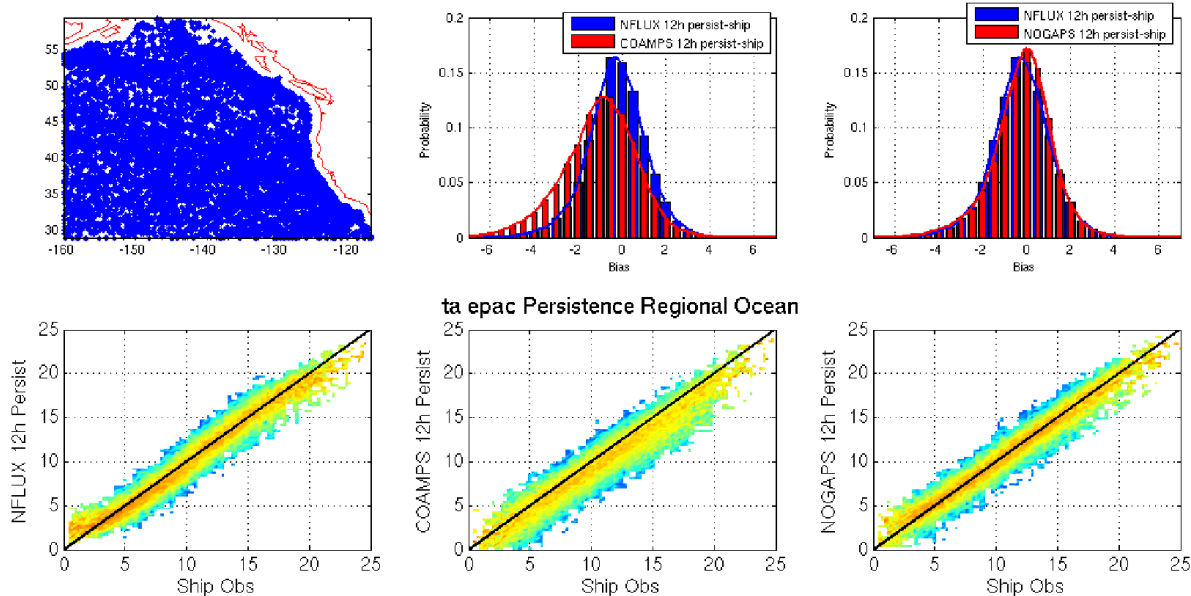


Figure 29: Air temperature over eastern Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

4.1.1 Seasonal

The eastern Pacific open ocean air temperature results by season are shown in Table 12. The corresponding scatterplots using assimilated (unassimilated) matchup observations versus NFLUX, COAMPS, and NOGAPS are shown in Figure 30 (Figure 31). The scatterplots show a larger spread in the COAMPS comparisons than either NFLUX or NOGAPS. Similar to the regional open ocean, NFLUX shows improvement over each COAMPS product in using both assimilated and unassimilated observations.

Comparing NFLUX to NOGAPS shows mixed results. Each NOGAPS product has a lower mean bias in all but the JJA season using both assimilated and unassimilated observations. As seen in the scatterplots, JJA air temperatures are warmer than the other seasons, generally not reaching below 5°C. This eliminates the warm bias at low temperatures that was present in NFLUX, resulting in NFLUX having a smaller mean bias compared to NOGAPS.

Using assimilated observations, NFLUX shows general improvement over NOGAPS in DJF and MAM for the remaining test statistics; although, the NOGAPS 12-hour forecast shows general improvement over NFLUX in JJA and SON. Using unassimilated observations, NFLUX shows overall improvement over NOGAPS in all but the JJA season for the remaining test statistics.

Table 12: Air temperature errors over the eastern Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|---------|--------|----------------|--------------------|---------|--------|--------|----------------|
| DJF N = 7982 | | | | | | | | | |
| NFLUX Analysis | -0.3251 | 1.1078 | 1.1545 | 0.9449 | NFLUX 12h persist | -0.3227 | 1.2812 | 1.3212 | 0.9259 |
| COAMPS Analysis | -0.9504 | 1.5522 | 1.8200 | 0.8928 | COAMPS 12h persist | -0.9341 | 1.7554 | 1.9884 | 0.8644 |
| COAMPS 12h fcst | -0.7864 | 1.2396 | 1.4679 | 0.9305 | NOGAPS 12h persist | -0.0461 | 1.4151 | 1.4157 | 0.9108 |
| NOGAPS Analysis | -0.0719 | 1.1698 | 1.1719 | 0.9386 | | | | | |
| NOGAPS 12h fcst | -0.0289 | 1.1440 | 1.1443 | 0.9412 | | | | | |
| MAM N = 6350 | | | | | | | | | |
| NFLUX Analysis | -0.5735 | 1.0948 | 1.2358 | 0.9390 | NFLUX 12h persist | -0.6207 | 1.2852 | 1.4271 | 0.9163 |
| COAMPS Analysis | -1.0095 | 1.5326 | 1.8351 | 0.8801 | COAMPS 12h persist | -1.0189 | 1.6877 | 1.9713 | 0.8557 |
| COAMPS 12h fcst | -0.9928 | 1.2358 | 1.5851 | 0.9219 | NOGAPS 12h persist | -0.2978 | 1.3847 | 1.4162 | 0.9019 |
| NOGAPS Analysis | -0.2645 | 1.1454 | 1.1754 | 0.9332 | | | | | |
| NOGAPS 12h fcst | -0.2026 | *1.1176 | 1.1357 | 0.9365 | | | | | |
| JJA N = 7677 | | | | | | | | | |
| NFLUX Analysis | 0.1599 | 1.2450 | 1.2551 | 0.8744 | NFLUX 12h persist | 0.1150 | 1.3939 | 1.3985 | 0.8437 |
| COAMPS Analysis | -1.0152 | 1.6039 | 1.8981 | 0.7906 | COAMPS 12h persist | -1.0500 | 1.6732 | 1.9753 | 0.7727 |
| COAMPS 12h fcst | -0.9385 | 1.2988 | 1.6023 | 0.8628 | NOGAPS 12h persist | -0.3326 | 1.3372 | 1.3779 | 0.8557 |
| NOGAPS Analysis | -0.3000 | *1.2130 | 1.2495 | 0.8807 | | | | | |
| NOGAPS 12h fcst | -0.2233 | 1.1954 | 1.2160 | 0.8840 | | | | | |
| SON N = 8651 | | | | | | | | | |
| NFLUX Analysis | -0.2689 | 1.1232 | 1.1549 | 0.9431 | NFLUX 12h persist | -0.2527 | 1.3095 | 1.3336 | 0.9229 |
| COAMPS Analysis | -1.0413 | 1.4686 | 1.8003 | 0.9065 | COAMPS 12h persist | -1.0242 | 1.7221 | 2.0036 | 0.8727 |
| COAMPS 12h fcst | -0.7705 | 1.1856 | 1.4139 | 0.9363 | NOGAPS 12h persist | -0.0466 | 1.4215 | 1.4222 | 0.9101 |
| NOGAPS Analysis | -0.0615 | *1.1133 | 1.1149 | 0.9443 | | | | | |
| NOGAPS 12h fcst | 0.0133 | 1.0776 | 1.0776 | 0.9476 | | | | | |

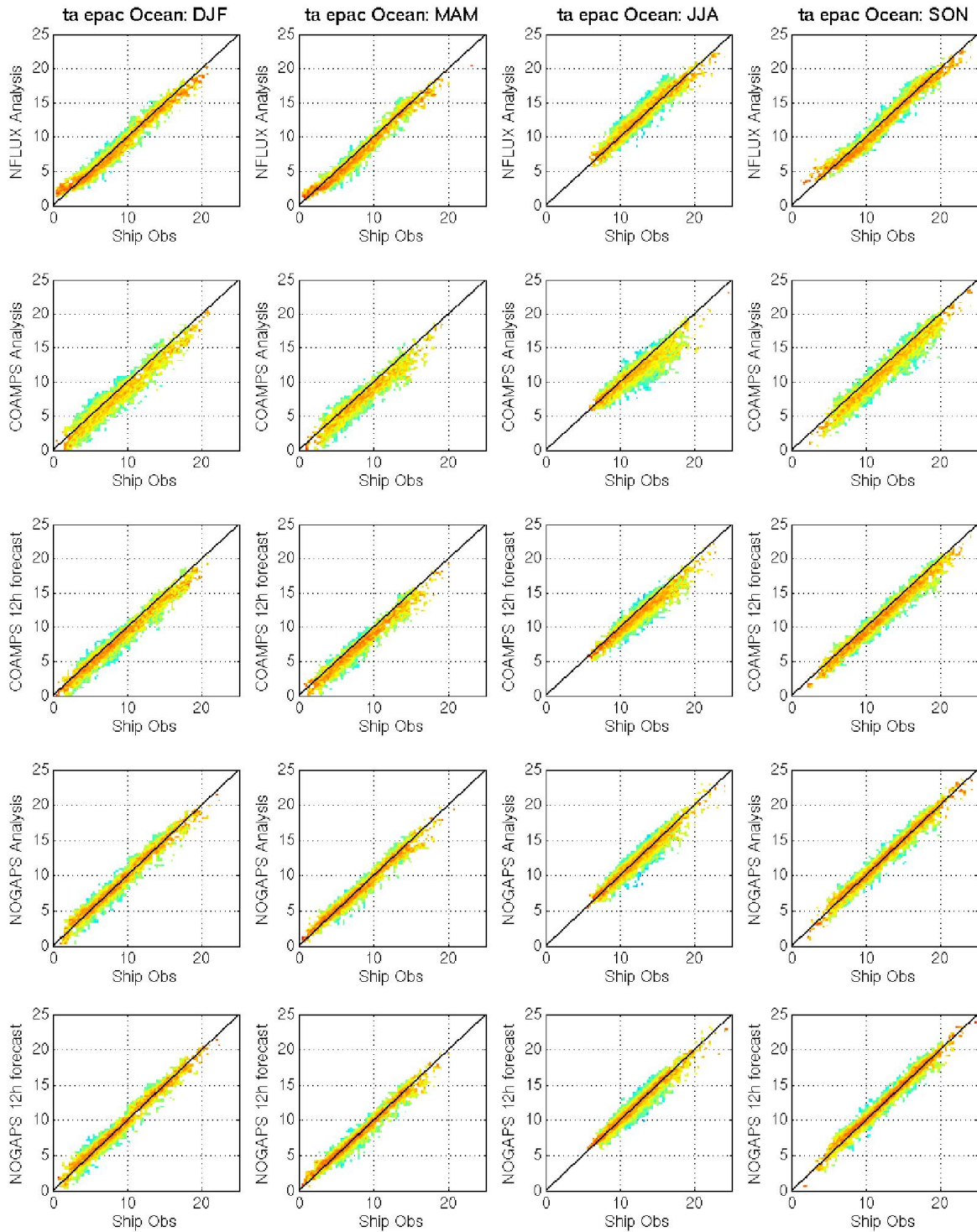


Figure 30: Air temperature over eastern Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

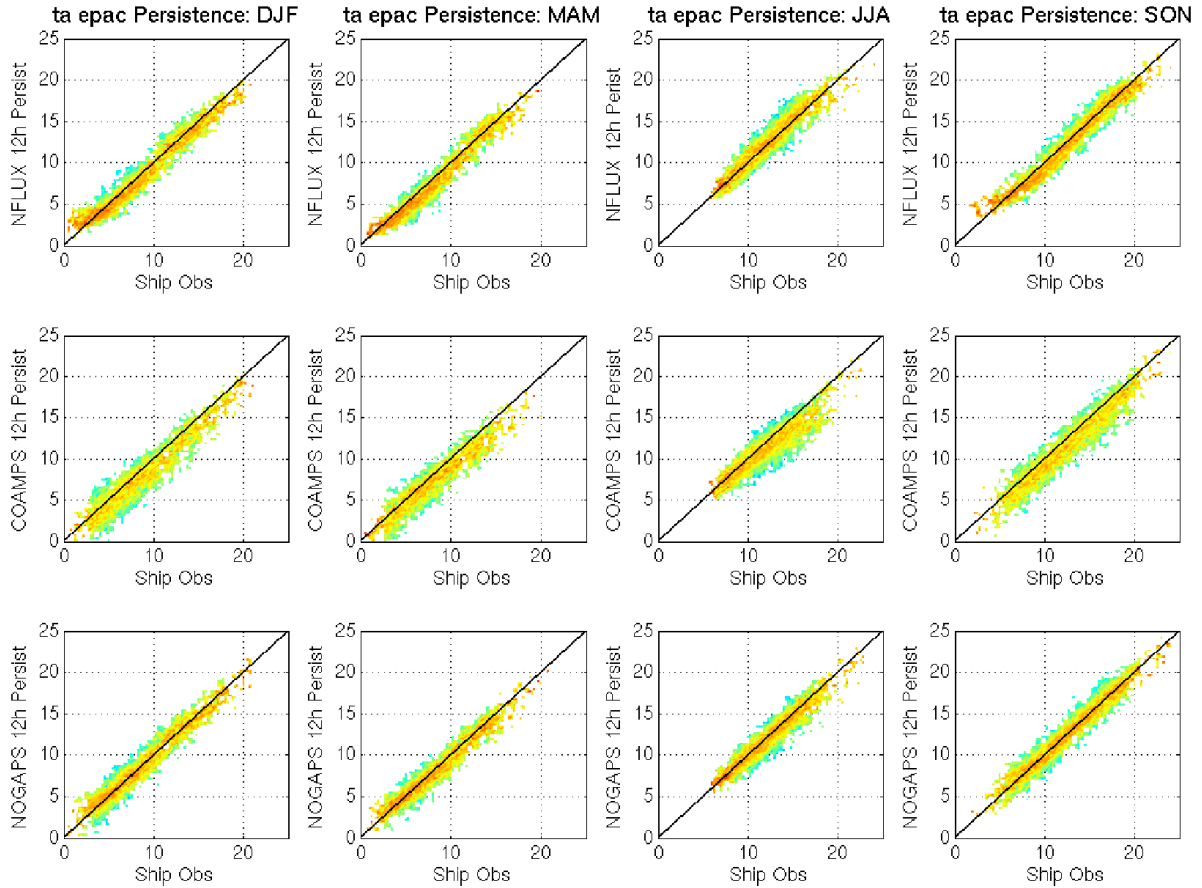


Figure 31: Air temperature over eastern Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

4.2 Specific Humidity Results

Figure 32 shows mean specific humidity error over the eastern Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left). Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared with *in situ* matchups, NFLUX shows a slight dry bias close to the coast with a near neutral to slight moist bias farther from the coast. NOGAPS and COAMPS show a dry bias throughout the region. The annual comparisons of NFLUX versus COAMPS and NOGAPS are very similar with NFLUX being moister over the region.

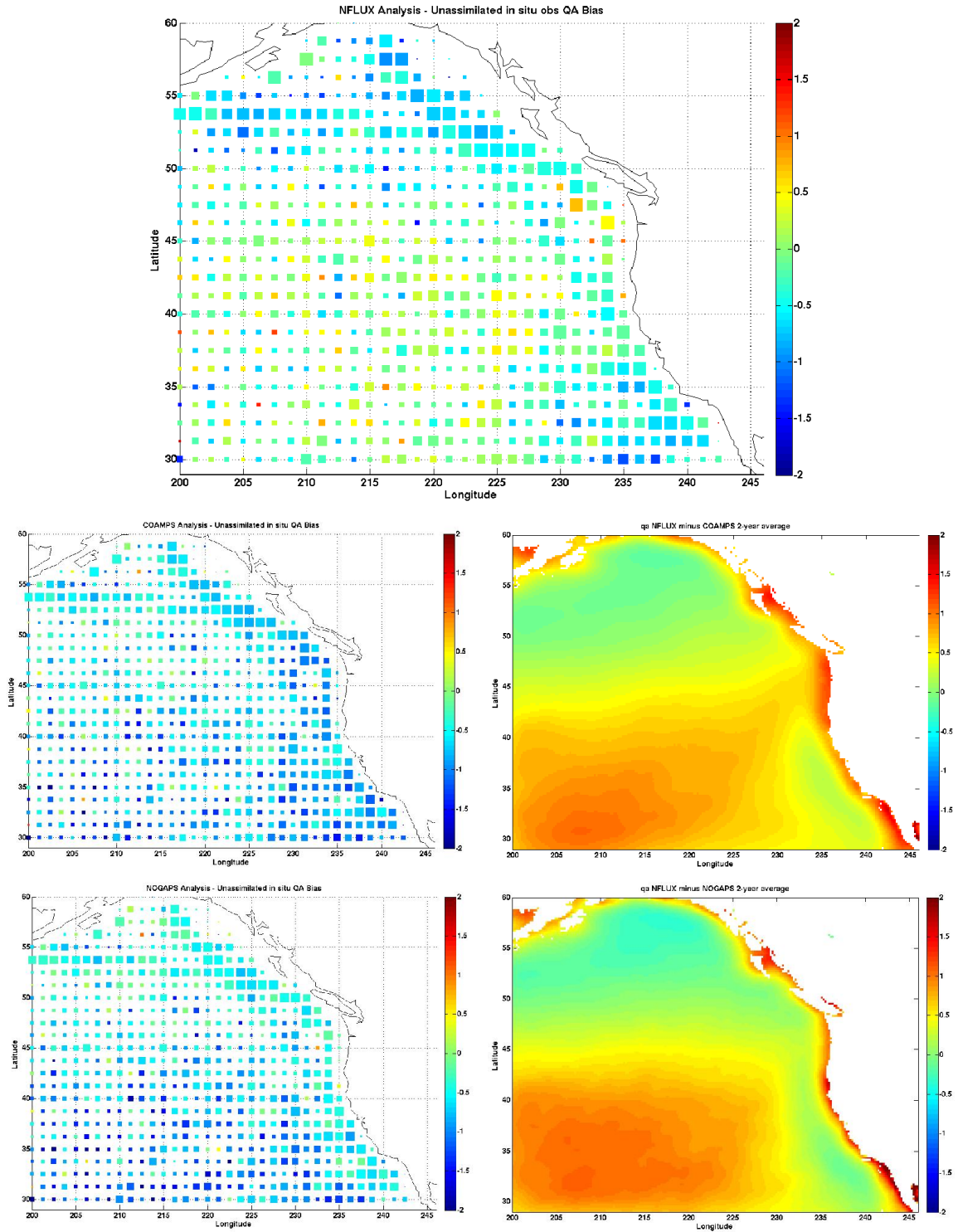


Figure 32: Eastern Pacific 2-year average specific humidity bias (g/kg). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

Eastern Pacific specific humidity test statistics are shown in Table 13. Over the open ocean NFLUX shows a smaller mean bias than COAMPS and NOGAPS using both assimilated and unassimilated observations. However, NFLUX also shows a larger standard deviation than either COAMPS or NOGAPS. NFLUX shows a lower (higher) correlation over both COAMPS and NOGAPS using assimilated (unassimilated) observations.

Table 13: Specific humidity errors over the eastern Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| Regional N = 29205 | | | | | | | | | |
| NFLUX Analysis | -0.0371 | 1.0794 | 1.0800 | 0.8261 | NFLUX 12h persist | -0.0406 | 1.2057 | 1.2064 | 0.7872 |
| COAMPS Analysis | -0.6743 | 1.0145 | 1.2182 | 0.8281 | COAMPS 12h persist | -0.6786 | 1.1592 | 1.3433 | 0.7782 |
| COAMPS 12h fcst | -0.3687 | 0.9511 | 1.0200 | 0.8489 | NOGAPS 12h persist | -0.5557 | 1.1250 | 1.2548 | 0.7912 |
| NOGAPS Analysis | -0.5375 | 0.8659 | 1.0192 | 0.8740 | | | | | |
| NOGAPS 12h fcst | -0.7179 | 1.0023 | 1.2329 | 0.8359 | | | | | |
| Coastal N = 14236 | | | | | | | | | |
| NFLUX Analysis | 0.1827 | 0.9724 | 0.9894 | 0.8087 | NFLUX 12h persist | 0.1917 | 1.1030 | 1.1195 | 0.7609 |
| COAMPS Analysis | -0.6752 | 1.0150 | 1.2191 | 0.7716 | COAMPS 12h persist | -0.6789 | *1.1056 | 1.2974 | 0.7309 |
| COAMPS 12h fcst | -0.3343 | *0.9545 | 1.0113 | 0.8004 | NOGAPS 12h persist | -0.5295 | 1.0178 | 1.1473 | 0.7684 |
| NOGAPS Analysis | -0.5321 | 0.8529 | 1.0052 | 0.8347 | | | | | |
| NOGAPS 12h fcst | -0.6913 | 0.9461 | 1.1717 | 0.8055 | | | | | |
| Ocean N = 14969 | | | | | | | | | |
| NFLUX Analysis | -0.2462 | 1.1332 | 1.1596 | 0.8450 | NFLUX 12h persist | -0.2615 | 1.2566 | 1.2835 | 0.8117 |
| COAMPS Analysis | -0.6735 | 1.0141 | 1.2174 | 0.8558 | COAMPS 12h persist | -0.6784 | 1.2081 | 1.3855 | 0.7979 |
| COAMPS 12h fcst | -0.4014 | 0.9467 | 1.0282 | 0.8742 | NOGAPS 12h persist | -0.5806 | 1.2178 | 1.3491 | 0.7967 |
| NOGAPS Analysis | -0.5426 | 0.8782 | 1.0323 | 0.8919 | | | | | |
| NOGAPS 12h fcst | -0.7432 | 1.0523 | 1.2883 | 0.8483 | | | | | |

Corresponding open ocean scatterplots using assimilated (unassimilated) matchup observations are shown in Figure 33 (Figure 34), along with histograms comparing the probability of the mean bias. Each of the products shows a linear relationship to the *in situ* matchups; however, NFLUX shows a wider spread in the observations compared to either COAMPS or NOGAPS which leads to a larger standard deviation. The slight moist bias seen at low specific humidity values in the global open ocean, at less than approximately 4 g/kg, can also be seen in this region.

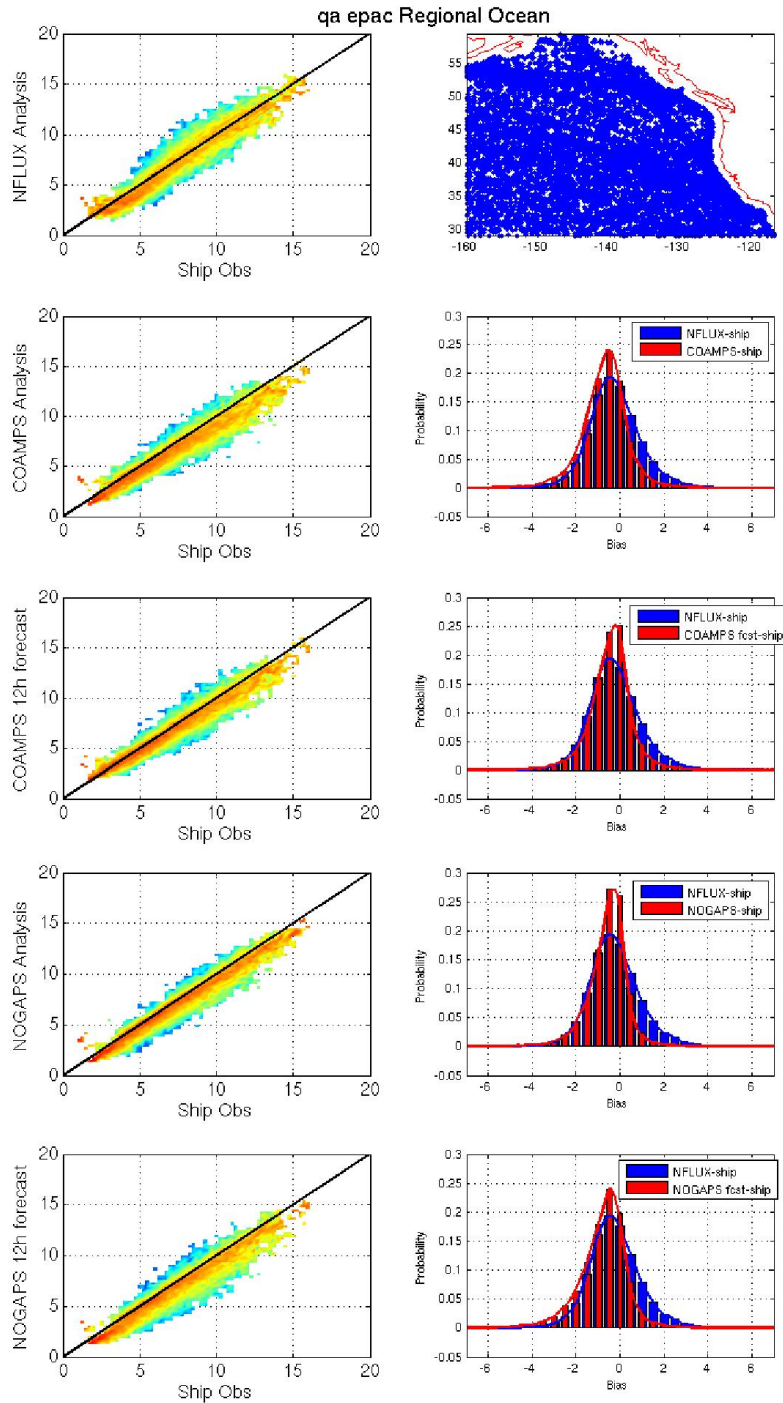


Figure 33: Specific humidity over eastern Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

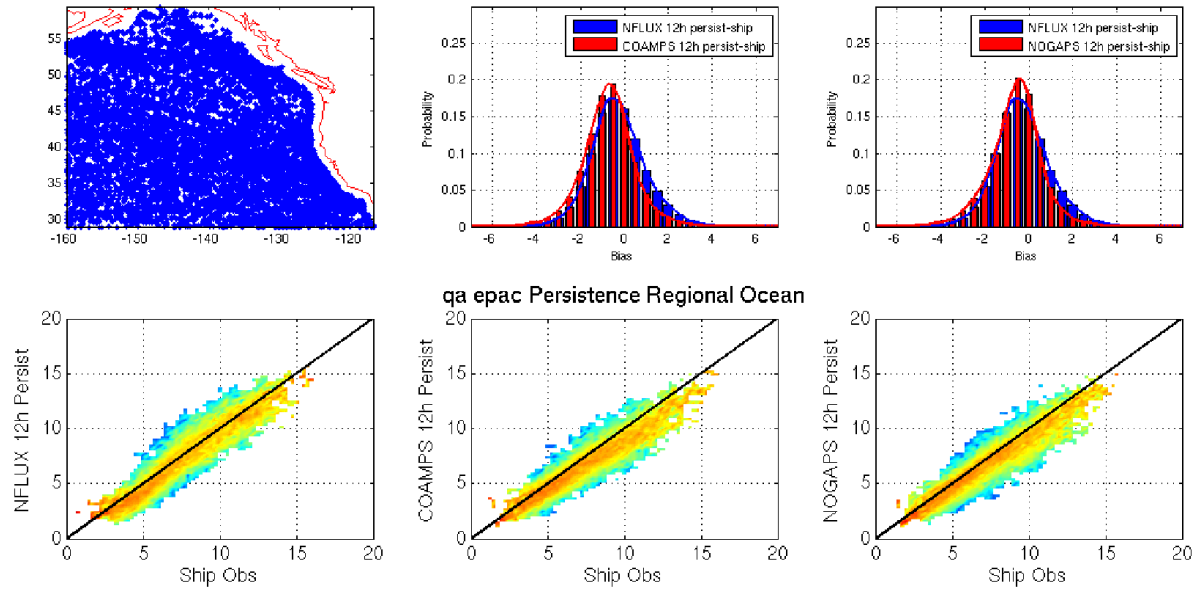


Figure 34: Specific humidity over eastern Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

4.2.1 Seasonal

The eastern Pacific open ocean results by season are given in Table 14. Figure 35 (Figure 36) shows the corresponding scatterplots of NFLUX, COAMPS, and NOGAPS versus assimilated (unassimilated) matchup observations. NFLUX has a smaller mean bias COAMPS or NOGAPS in each season except DJF and MAM using assimilated matchups. As in the total regional open ocean, NFLUX shows a larger spread in the scatterplots. This causes NFLUX to have a larger or no significant difference in the standard deviation for each season. Using assimilated matchups, the NOGAPS analysis shows a higher correlation than NFLUX in each season. Using unassimilated matchups NFLUX shows a higher correlation for each season except JJA.

Table 14: Specific humidity errors over the eastern Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|---------|--------|----------------|--------------------|----------|---------|--------|----------------|
| DJF | | | | | N = 4366 | | | | |
| NFLUX Analysis | -0.5463 | 1.0399 | 1.1745 | 0.8406 | NFLUX 12h persist | -0.5488 | 1.2089 | 1.3275 | 0.7926 |
| COAMPS Analysis | -0.6886 | 0.9942 | 1.2093 | 0.8420 | COAMPS 12h persist | -0.6725 | *1.1961 | 1.3721 | 0.7764 |
| COAMPS 12h fcst | -0.4058 | 0.9340 | 1.0182 | 0.8600 | NOGAPS 12h persist | -0.6674 | *1.2494 | 1.4163 | 0.7565 |
| NOGAPS Analysis | -0.6431 | 0.9212 | 1.1234 | 0.8642 | | | | | |
| NOGAPS 12h fcst | -0.8579 | 1.0892 | 1.3864 | 0.8143 | | | | | |
| MAM | | | | | N = 2899 | | | | |
| NFLUX Analysis | -0.4514 | 1.0471 | 1.1401 | 0.8345 | NFLUX 12h persist | -0.4944 | 1.1296 | 1.2329 | 0.8061 |
| COAMPS Analysis | -0.5309 | 0.9714 | 1.1069 | 0.8242 | COAMPS 12h persist | *-0.5426 | *1.1271 | 1.2507 | 0.7658 |
| COAMPS 12h fcst | -0.3813 | 0.9197 | 0.9954 | 0.8420 | NOGAPS 12h persist | -0.6028 | *1.1516 | 1.2996 | 0.7556 |
| NOGAPS Analysis | -0.5441 | 0.8536 | 1.0122 | 0.8637 | | | | | |
| NOGAPS 12h fcst | -0.7290 | *1.0061 | 1.2422 | 0.8118 | | | | | |
| JJA | | | | | N = 3400 | | | | |
| NFLUX Analysis | 0.2444 | 1.1508 | 1.1763 | 0.7530 | NFLUX 12h persist | 0.2040 | 1.2147 | 1.2316 | 0.7281 |
| COAMPS Analysis | -0.7029 | 1.0095 | 1.2299 | 0.7926 | COAMPS 12h persist | -0.7479 | 1.0907 | 1.3224 | 0.7587 |
| COAMPS 12h fcst | -0.4382 | 0.9280 | 1.0261 | 0.8246 | NOGAPS 12h persist | -0.4365 | 1.0442 | 1.1316 | 0.7776 |
| NOGAPS Analysis | -0.3728 | 0.7671 | 0.8528 | 0.8805 | | | | | |
| NOGAPS 12h fcst | -0.4852 | 0.9184 | 1.0386 | 0.8278 | | | | | |
| SON | | | | | N = 4304 | | | | |
| NFLUX Analysis | -0.1911 | 1.1280 | 1.1439 | 0.8524 | NFLUX 12h persist | -0.1810 | 1.2991 | 1.3115 | 0.8076 |
| COAMPS Analysis | -0.7309 | 1.0567 | 1.2847 | 0.8625 | COAMPS 12h persist | -0.7210 | *1.3461 | 1.5269 | 0.7821 |
| COAMPS 12h fcst | -0.3814 | 0.9904 | 1.0612 | 0.8788 | NOGAPS 12h persist | -0.5915 | *1.3402 | 1.4648 | 0.7851 |
| NOGAPS Analysis | -0.5738 | 0.9122 | 1.0776 | 0.8972 | | | | | |
| NOGAPS 12h fcst | -0.8404 | *1.1069 | 1.3896 | 0.8537 | | | | | |

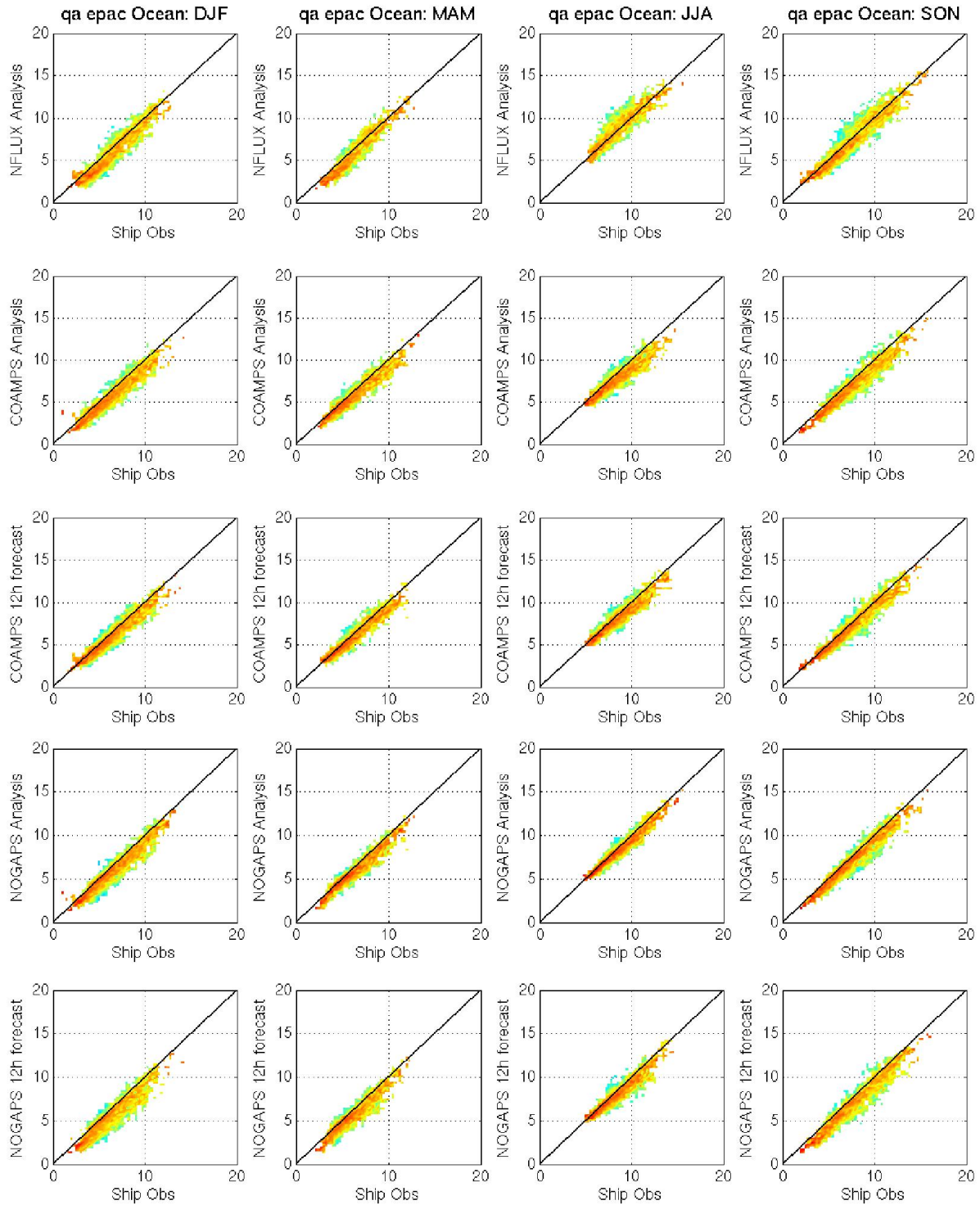


Figure 35: Specific humidity over eastern Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

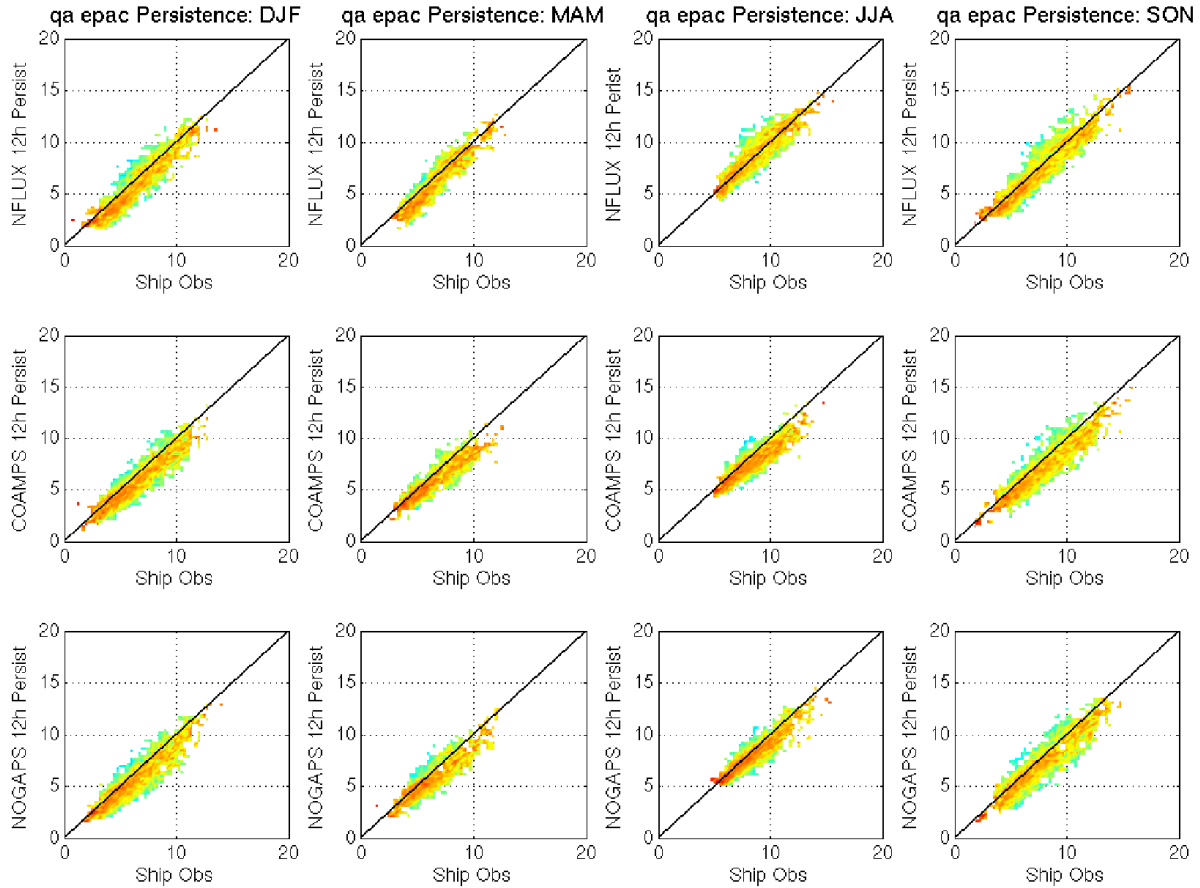


Figure 36: Specific humidity over eastern Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

4.3 Wind Speed Results

Figure 37 shows mean wind speed error over the eastern Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left). Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared to *in situ* observations, NFLUX and COAMPS show higher wind speeds near the coast, and lower wind speeds farther from the coast. This results in the annual difference between NFLUX and COAMPS to be relatively small throughout the region. NOGAPS shows an overall low wind speed bias compared to the *in situ* matchups. This causes much larger differences compared to NFLUX. As discussed with the global test case, NOGAPS also has a coarser resolution than NFLUX or COAMPS. The different resolutions, along with the smooth coastal topography and overall bias differences, cause larger differences between NFLUX and NOGAPS in the coastal region than in the open ocean.

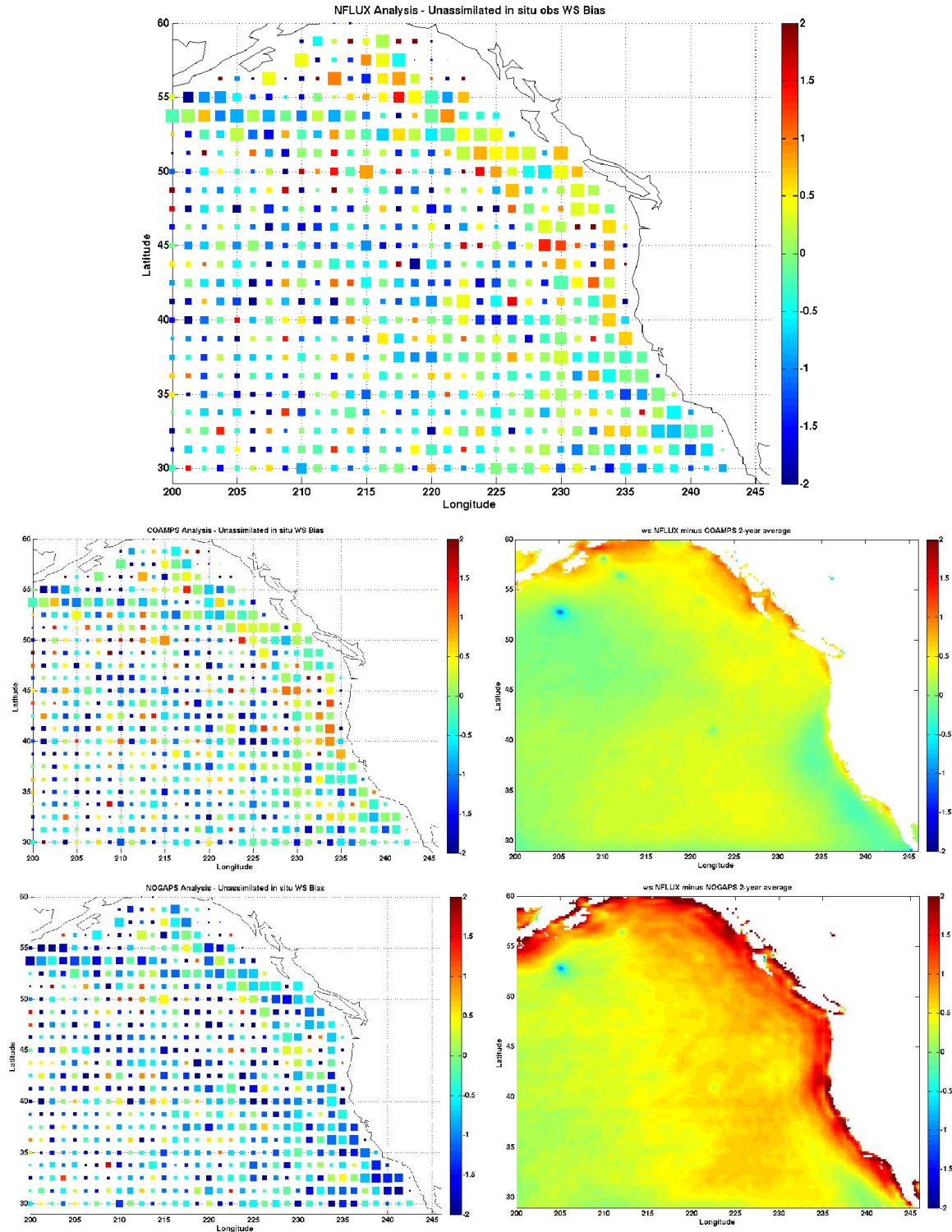


Figure 37: Eastern Pacific 2-year average wind speed bias (m/s). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

Wind speed test statistics are shown in Table 15 for the eastern Pacific region. Using both assimilated and unassimilated matchups in the open ocean, NFLUX shows a smaller mean bias compared to NOGAPS, but a larger mean bias compared to COAMPS. NFLUX also shows improvement or no statistical difference over each COAMPS and NOGAPS product for the remaining test statistics using both assimilated and unassimilated matchups.

Table 15: Wind speed errors over the eastern Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|---------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Regional N = 90157 | | | | | | | | | |
| NFLUX Analysis | 0.2716 | 2.2491 | 2.2655 | 0.6750 | NFLUX 12h persist | 0.2658 | 3.5989 | 3.6087 | 0.2898 |
| COAMPS Analysis | -0.0879 | 2.4779 | 2.4795 | 0.6294 | COAMPS 12h persist | -0.0995 | 3.8162 | 3.8175 | 0.2583 |
| COAMPS 12h fcst | -0.1103 | 2.6476 | 2.6498 | 0.5831 | NOGAPS 12h persist | -1.0974 | 3.6089 | 3.7721 | 0.2940 |
| NOGAPS Analysis | -1.0922 | 2.3301 | 2.5734 | 0.6570 | | | | | |
| NOGAPS 12h fcst | -0.7431 | 2.4936 | 2.6020 | 0.6230 | | | | | |
| Coastal N = 61705 | | | | | | | | | |
| NFLUX Analysis | 0.2888 | 2.3665 | 2.3840 | 0.6342 | NFLUX 12h persist | 0.2949 | 3.6604 | 3.6722 | 0.2585 |
| COAMPS Analysis | -0.1527 | 2.5808 | 2.5853 | 0.5853 | COAMPS 12h persist | -0.1511 | 3.8553 | 3.8582 | 0.2251 |
| COAMPS 12h fcst | -0.1028 | 2.7570 | 2.7589 | 0.5397 | NOGAPS 12h persist | -1.3660 | 3.6032 | 3.8534 | 0.2579 |
| NOGAPS Analysis | -1.3680 | 2.4320 | 2.7903 | 0.6082 | | | | | |
| NOGAPS 12h fcst | -0.9276 | 2.6344 | 2.7930 | 0.5660 | | | | | |
| Ocean N = 28452 | | | | | | | | | |
| NFLUX Analysis | 0.2342 | 1.9704 | 1.9842 | 0.7229 | NFLUX 12h persist | 0.2026 | 3.4609 | 3.4668 | 0.2827 |
| COAMPS Analysis | 0.0527 | 2.2321 | 2.2327 | 0.6738 | COAMPS 12h persist | 0.0123 | 3.7277 | 3.7276 | 0.2483 |
| COAMPS 12h fcst | -0.1264 | 2.3931 | 2.3964 | 0.6269 | NOGAPS 12h persist | -0.5150 | 3.5524 | 3.5895 | 0.2687 |
| NOGAPS Analysis | -0.4939 | *1.9632 | 2.0244 | 0.7290 | | | | | |
| NOGAPS 12h fcst | -0.3430 | 2.1019 | 2.1296 | 0.6981 | | | | | |

Scatterplots and corresponding histograms of the probability of the mean bias for the open ocean using assimilated (unassimilated) matchup observations are shown in Figure 38 (Figure 39). NFLUX shows a closer fit to the *in situ* observations than either COAMPS or NOGAPS. This agrees with NFLUX having a smaller standard deviation and larger correlation. At low wind speeds, less than approximately 5 m/s, each of the products show a high wind speed bias. A high bias at low wind speeds was also identified in the global test case.

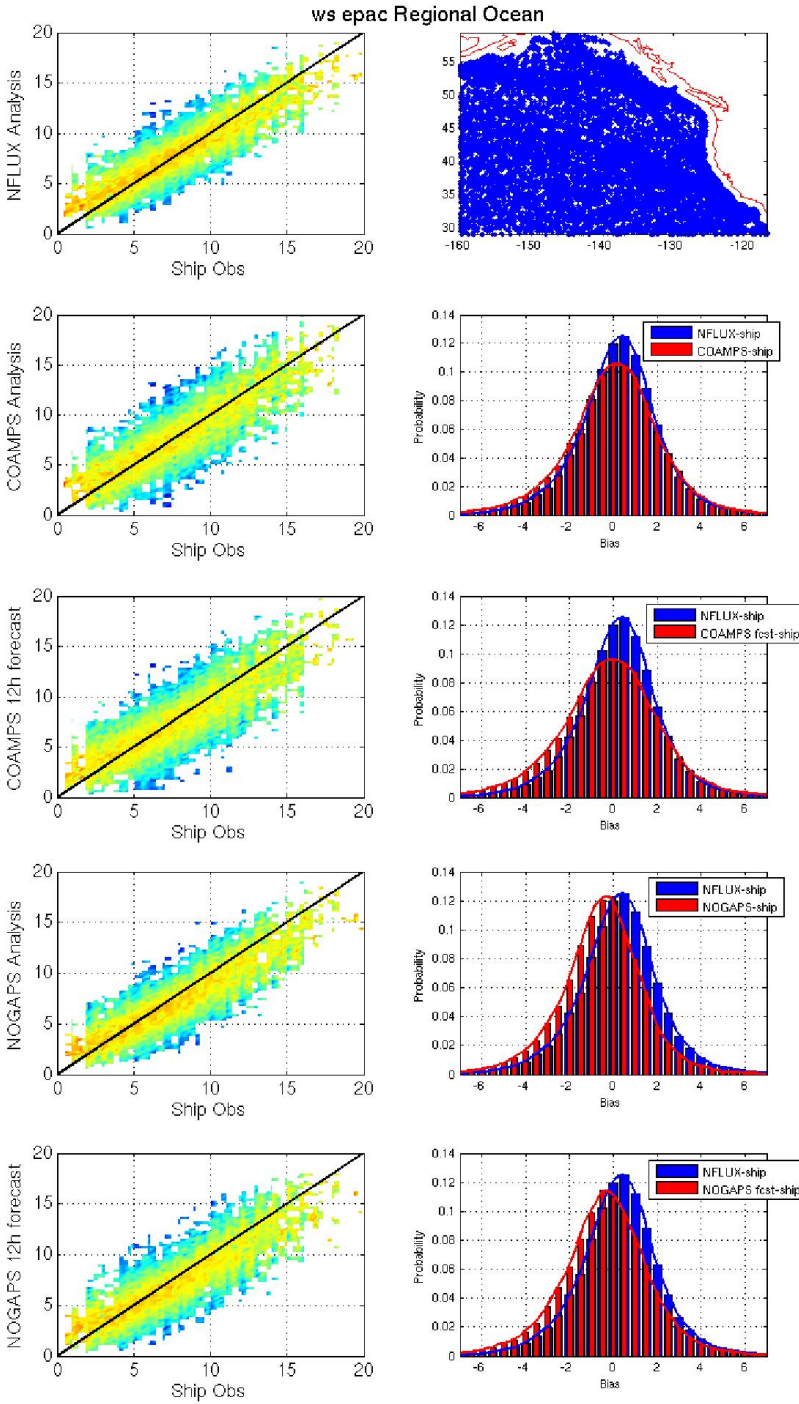


Figure 38: Wind speed over eastern Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

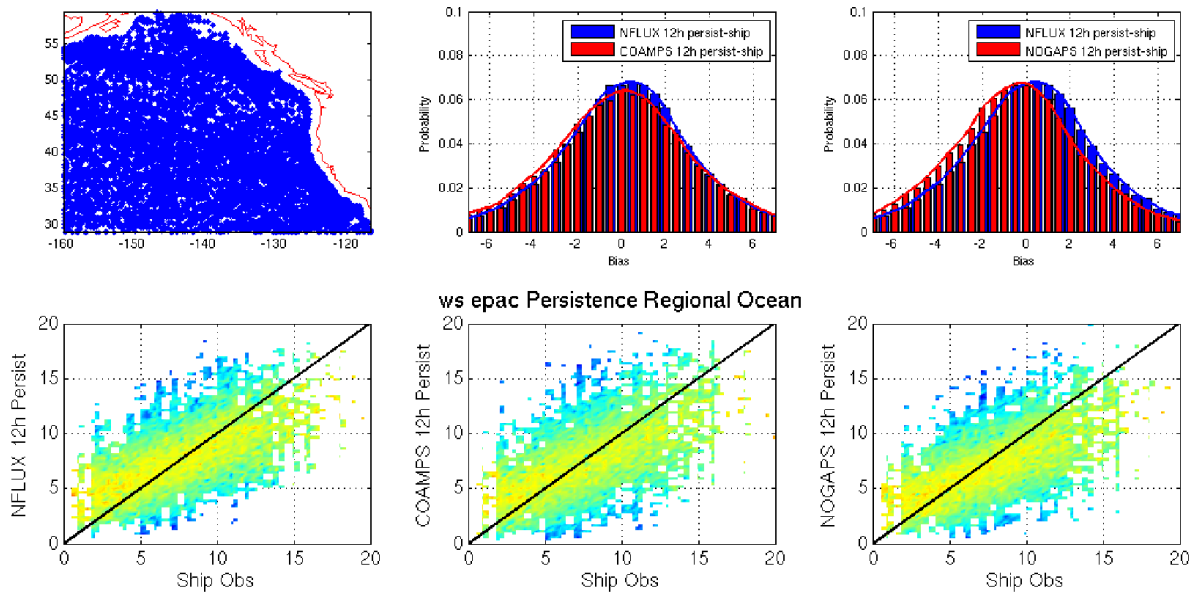


Figure 39: Wind speed over eastern Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

4.3.1 Seasonal

The eastern Pacific open ocean results by season are shown in Table 16, with corresponding scatterplots of wind speed versus assimilated (unassimilated) *in situ* matchups shown in Figure 40 (Figure 41). NFLUX shows improvement over COAMPS using both assimilated and unassimilated matchups in all seasons. NFLUX also shows improvement or no significant difference compared to NOGAPS in all seasons except SON using assimilated matchups.

As mentioned before, the north Pacific is known for frequent storm tracks year round, with the peak in storm activity from December through March (Graham and Diaz, 2001). Higher wind speeds are associated with these storms. As seen in the scatterplots, the observed wind speed range is reduced in JJA, when the north Pacific storms are less frequent. The high wind speed bias at low wind speeds is still present in each season, with the most noticeable bias in JJA when the average wind speed is lower than the other seasons.

Table 16: Wind speed errors over the eastern Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| DJF | | | | | N = 7388 | | | | |
| NFLUX Analysis | 0.2122 | 2.2313 | 2.2412 | 0.6884 | NFLUX 12h persist | 0.1949 | 3.9257 | 3.9303 | 0.2161 |
| COAMPS Analysis | 0.0550 | 2.5653 | 2.5658 | 0.6205 | COAMPS 12h persist | *0.0447 | 4.2417 | 4.2416 | 0.1793 |
| COAMPS 12h fcst | -0.1089 | 2.7200 | 2.7220 | 0.5775 | NOGAPS 12h persist | -0.4409 | *4.0187 | 4.0425 | 0.2070 |
| NOGAPS Analysis | -0.4327 | *2.1726 | 2.2152 | 0.7086 | | | | | |
| NOGAPS 12h fcst | -0.3035 | 2.3506 | 2.3699 | 0.6686 | | | | | |
| MAM | | | | | N = 5583 | | | | |
| NFLUX Analysis | 0.2587 | 1.9899 | 2.0065 | 0.6969 | NFLUX 12h persist | 0.2557 | 3.4515 | 3.4606 | 0.2571 |
| COAMPS Analysis | -0.2045 | 2.3351 | 2.3438 | 0.6194 | COAMPS 12h persist | -0.1955 | 3.6869 | 3.6918 | 0.2248 |
| COAMPS 12h fcst | -0.1412 | 2.4142 | 2.4181 | 0.5964 | NOGAPS 12h persist | -0.5620 | *3.5257 | 3.5699 | 0.2411 |
| NOGAPS Analysis | -0.5609 | *1.9969 | 2.0740 | 0.6985 | | | | | |
| NOGAPS 12h fcst | -0.3580 | 2.1240 | 2.1537 | 0.6688 | | | | | |
| JJA | | | | | N = 7306 | | | | |
| NFLUX Analysis | 0.2088 | 1.6179 | 1.6312 | 0.6784 | NFLUX 12h persist | 0.1631 | 2.5268 | 2.5318 | 0.3078 |
| COAMPS Analysis | 0.0609 | 1.8506 | 1.8515 | 0.6171 | COAMPS 12h persist | 0.0075 | 2.7045 | 2.7043 | 0.2879 |
| COAMPS 12h fcst | -0.2840 | 1.9631 | 1.9834 | 0.5538 | NOGAPS 12h persist | -0.5774 | *2.6031 | 2.6662 | 0.2855 |
| NOGAPS Analysis | -0.5467 | 1.7373 | 1.8212 | 0.6362 | | | | | |
| NOGAPS 12h fcst | -0.4350 | 1.8087 | 1.8601 | 0.6097 | | | | | |
| SON | | | | | N = 8175 | | | | |
| NFLUX Analysis | 0.2601 | 1.9921 | 2.0089 | 0.7499 | NFLUX 12h persist | 0.2087 | 3.7309 | 3.7365 | 0.2712 |
| COAMPS Analysis | *0.2189 | 2.1300 | 2.1411 | 0.7387 | COAMPS 12h persist | *0.1293 | 4.0303 | 4.0321 | 0.2364 |
| COAMPS 12h fcst | 0.0086 | 2.4048 | 2.4046 | 0.6712 | NOGAPS 12h persist | -0.4942 | *3.8440 | 3.8754 | 0.2559 |
| NOGAPS Analysis | -0.4562 | 1.9284 | 1.9815 | 0.7686 | | | | | |
| NOGAPS 12h fcst | -0.2863 | 2.0898 | 2.1092 | 0.7390 | | | | | |

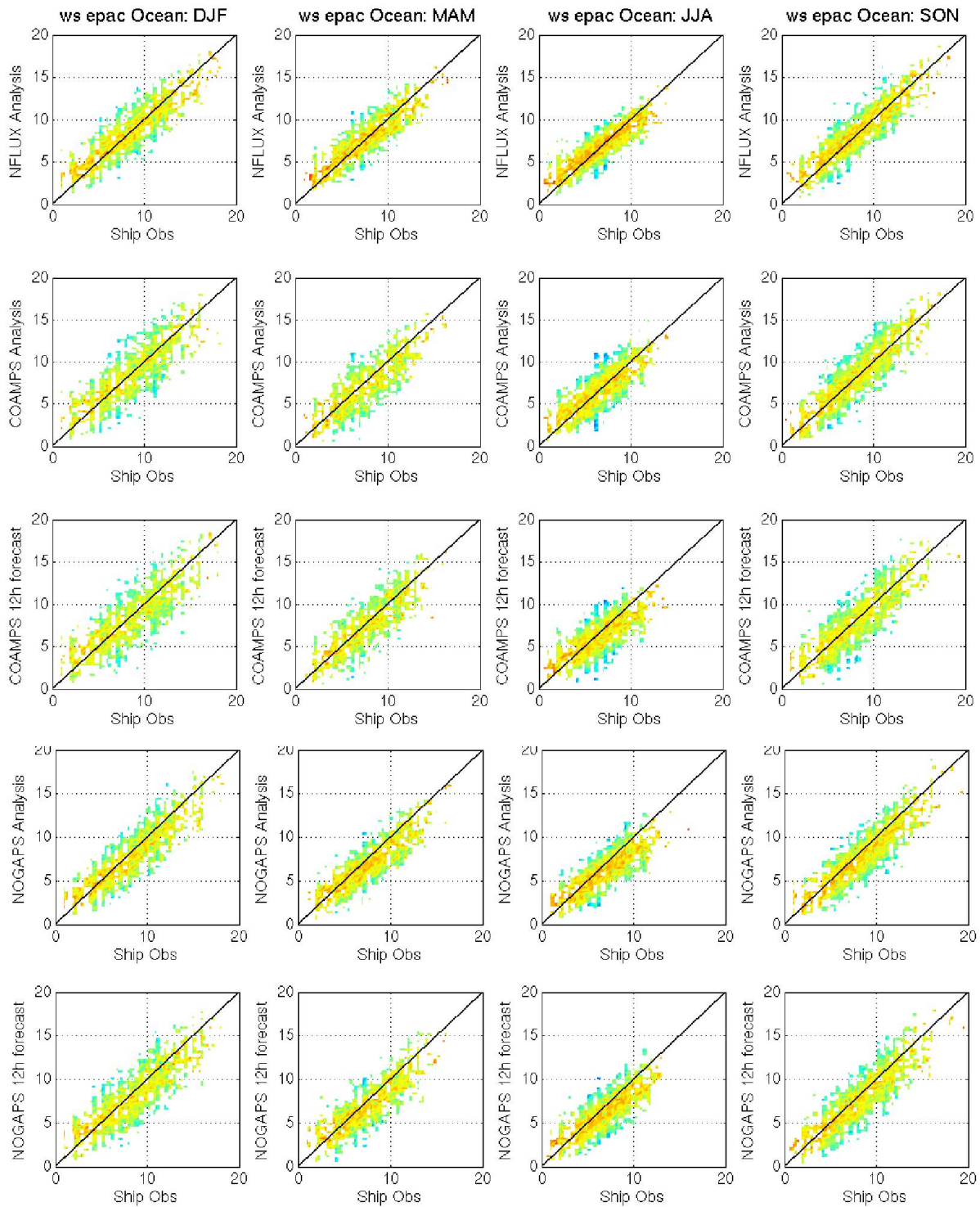


Figure 40: Wind speed over eastern Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

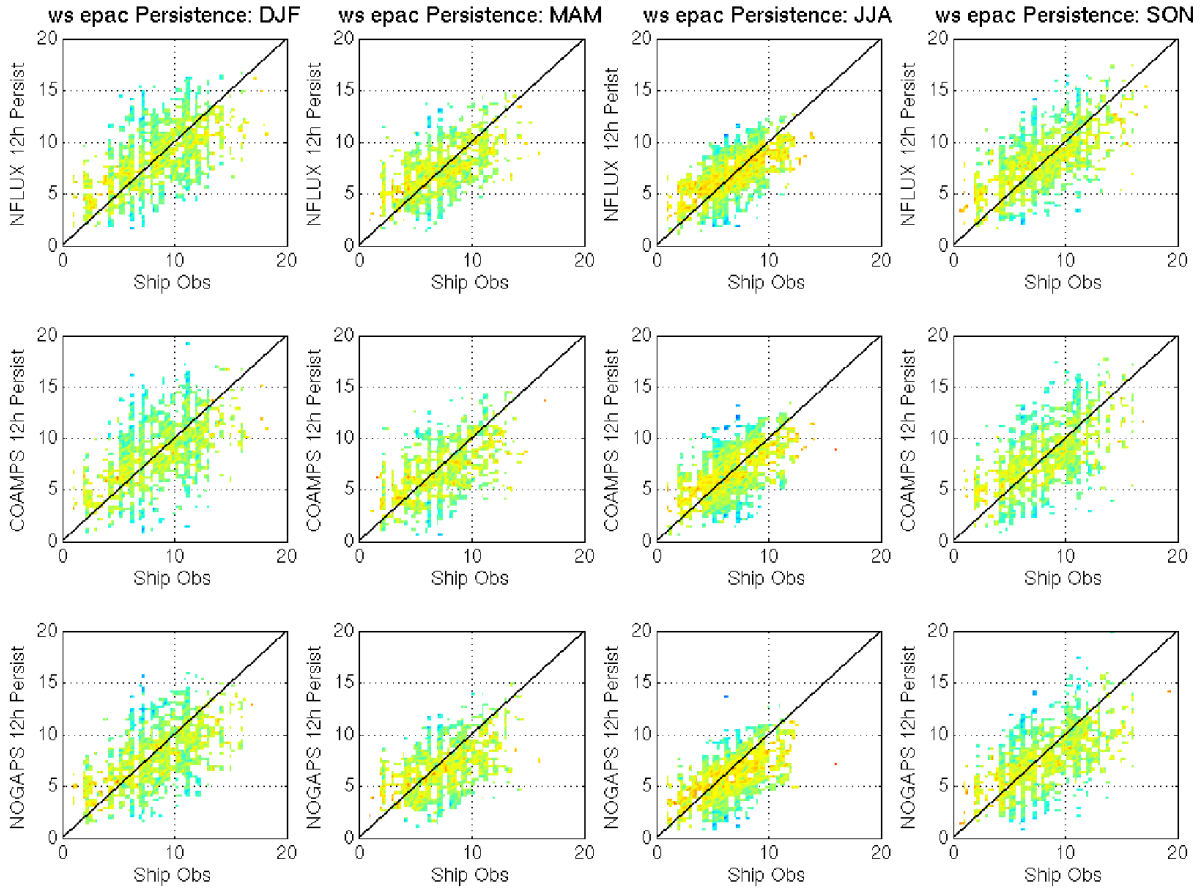


Figure 41: Wind speed over eastern Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

5.0 TEST CASE 3: WESTERN PACIFIC

The western Pacific domain spans from 95°-180°E and 7°S-45°N with a horizontal resolution of .2 degrees. The grid has 426 x 261 grid points. The NFLUX grid domain and resolution matches the western Pacific COAMPS domain. The COAMPS 12-hour forecast is blended with the previous NFLUX correction field to generate the background field for the NFLUX analysis. NFLUX analysis performance is compared against both the western Pacific COAMPS analysis and 12-hour forecast fields, as well as the NOGAPS analysis and 12-hour forecast fields over the western Pacific. Validation statistics are calculated for both the assimilated and unassimilated *in situ* matchup data.

5.1 Air Temperature Results

Figure 42 shows mean air temperature error over the western Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left).

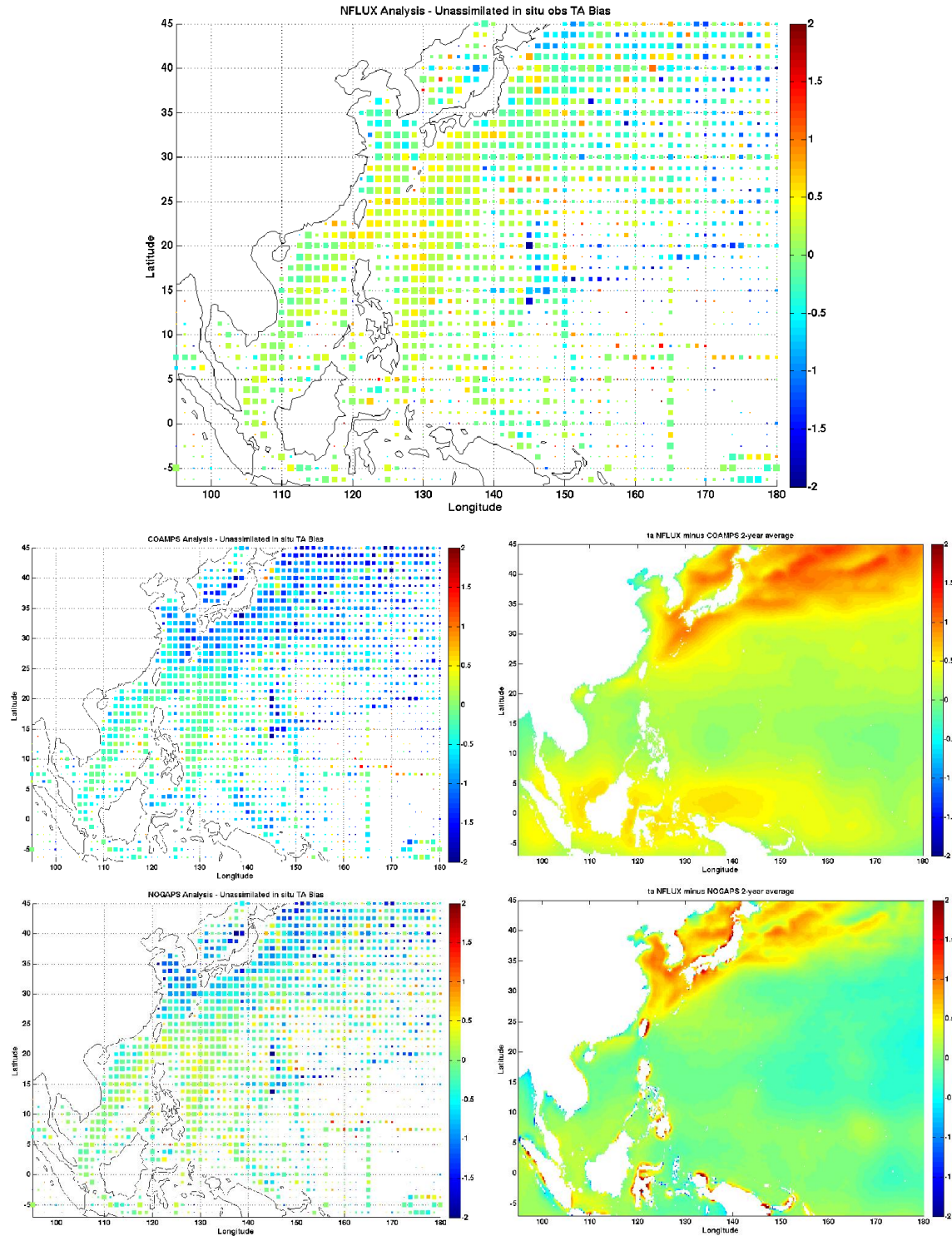


Figure 42: Western Pacific 2-year average air temperature bias (°C). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared with the *in situ* matchups, NFLUX shows an overall warm bias throughout the region with the largest differences along the Kuroshio Current. Both COAMPS and NOGAPS show a cold bias in the northern part of the region and a warm bias in the south western part of the region. The annual difference comparisons show the largest differences along the Kuroshio Current. The NFLUX and COAMPS annual comparison also shows a large difference along the equator; this is due to COAMPS showing a cold bias and NFLUX showing a warm bias in this area.

Air temperature test statistics over the western Pacific are shown in Table 17 using assimilated and unassimilated *in situ* matchups. NFLUX shows improvement over both COAMPS and NOGAPS in all test statistics using both assimilated and unassimilated matchups. It is interesting to note that NOGAPS performs better than COAMPS, as in the eastern Pacific.

Table 17: Air temperature errors over the western Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Regional N = 70980 | | | | | | | | | |
| NFLUX Analysis | -0.1290 | 1.1252 | 1.1326 | 0.9779 | NFLUX 12h persist | -0.1475 | 1.4867 | 1.4940 | 0.9614 |
| COAMPS Analysis | -0.5444 | 1.4502 | 1.5490 | 0.9653 | COAMPS 12h persist | -0.5324 | 1.6968 | 1.7784 | 0.9526 |
| COAMPS 12h fcst | -0.7131 | 1.3584 | 1.5342 | 0.9694 | NOGAPS 12h persist | -0.2732 | 1.6395 | 1.6621 | 0.9560 |
| NOGAPS Analysis | -0.2780 | 1.3702 | 1.3981 | 0.9697 | | | | | |
| NOGAPS 12h fcst | -0.2202 | 1.3772 | 1.3947 | 0.9691 | | | | | |
| Coastal N = 20797 | | | | | | | | | |
| NFLUX Analysis | -0.1476 | 1.3984 | 1.4062 | 0.9751 | NFLUX 12h persist | -0.1717 | 1.9184 | 1.9261 | 0.9532 |
| COAMPS Analysis | -0.5466 | 1.7907 | 1.8722 | 0.9612 | COAMPS 12h persist | -0.5263 | 2.1705 | 2.2333 | 0.9432 |
| COAMPS 12h fcst | -0.8450 | 1.6797 | 1.8802 | 0.9651 | NOGAPS 12h persist | -0.3641 | 2.1828 | 2.2129 | 0.9449 |
| NOGAPS Analysis | -0.3796 | 1.7749 | 1.8150 | 0.9637 | | | | | |
| NOGAPS 12h fcst | -0.3217 | 1.7901 | 1.8188 | 0.9627 | | | | | |
| Ocean N = 50183 | | | | | | | | | |
| NFLUX Analysis | -0.1212 | 0.9901 | 0.9975 | 0.9738 | NFLUX 12h persist | -0.1375 | 1.2652 | 1.2727 | 0.9573 |
| COAMPS Analysis | -0.5435 | 1.2829 | 1.3933 | 0.9595 | COAMPS 12h persist | -0.5349 | 1.4560 | 1.5512 | 0.9478 |
| COAMPS 12h fcst | -0.6584 | 1.1960 | 1.3653 | 0.9642 | NOGAPS 12h persist | -0.2355 | 1.3501 | 1.3704 | 0.9543 |
| NOGAPS Analysis | -0.2359 | 1.1593 | 1.1831 | 0.9663 | | | | | |
| NOGAPS 12h fcst | -0.1782 | 1.1614 | 1.1749 | 0.9659 | | | | | |

The western Pacific open ocean scatterplots using assimilated (unassimilated) matchups and the corresponding histograms of the probability of the mean bias are shown in Figure 43 (Figure 44).

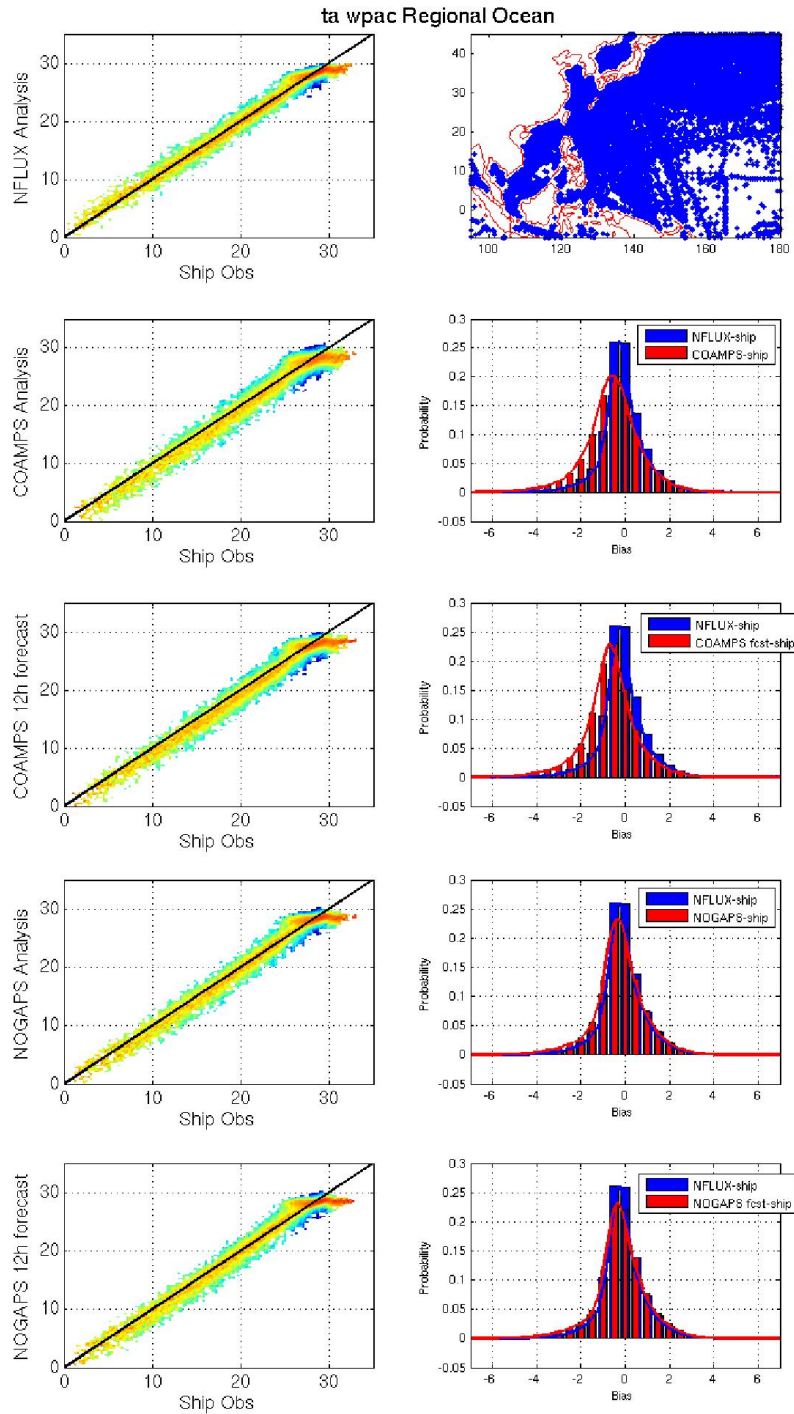


Figure 43: Air temperature over western Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

As discussed in the global test case, the models are not able to properly resolve temperatures above approximately 30°C, even if the *in situ* observations are warmer. This same feature is seen in the western Pacific, causing a capping effect at high temperatures. The warm bias that was seen at low temperatures with NFLUX in the global test case is not seen in the western Pacific.

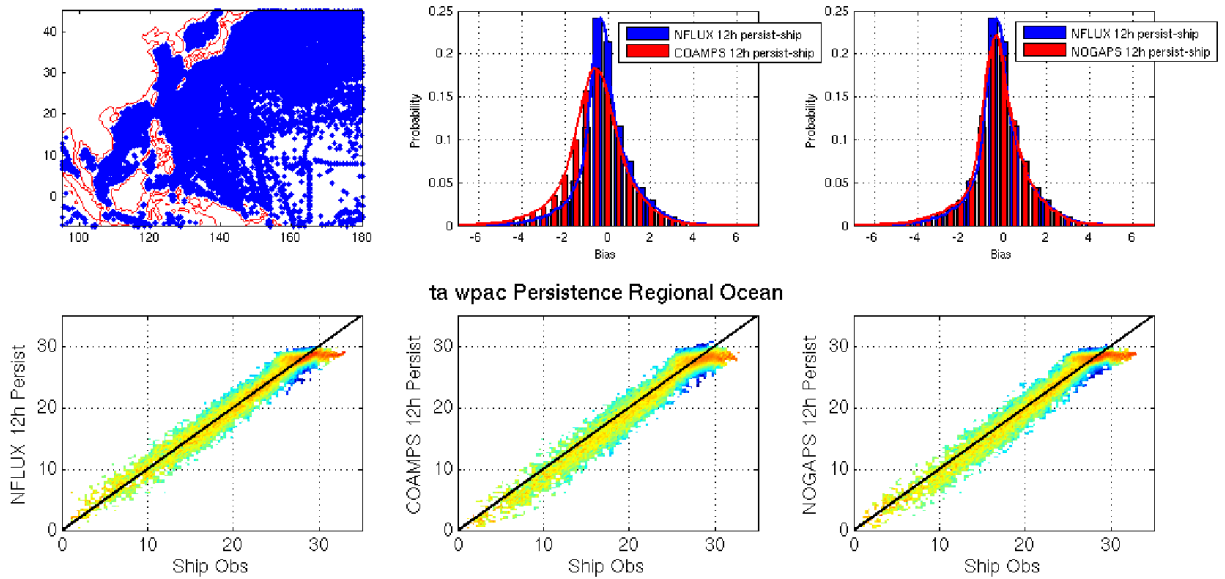


Figure 44: Air temperature over western Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

In the 25° to 30°C *in situ* temperature range, an extended area of relatively constant temperatures can be seen for each of the models in the scatterplots. This feature is present in the western Pacific; however, it was not seen in either the global or eastern Pacific test cases. The western Pacific test case contains a feature called the western Pacific warm pool (Cravatte et al., 2009; Dayem et al., 2007). The warm pool is defined as an area with SSTs greater than 28.5°C, typically found within 10°S to 10°N and 130°E to 170°E. By focusing only on the warm pool region, the feature can easily be seen with each of the models in the top panels of Figure 45. The bottom panels of Figure 45 compare the SST fields used in each of the models to the *in situ* SST. The extended area of constant model temperatures is also seen in the SST matchups. By removing the warm pool from our matchup observations (Figure 46), the extended constant temperatures feature is no longer present

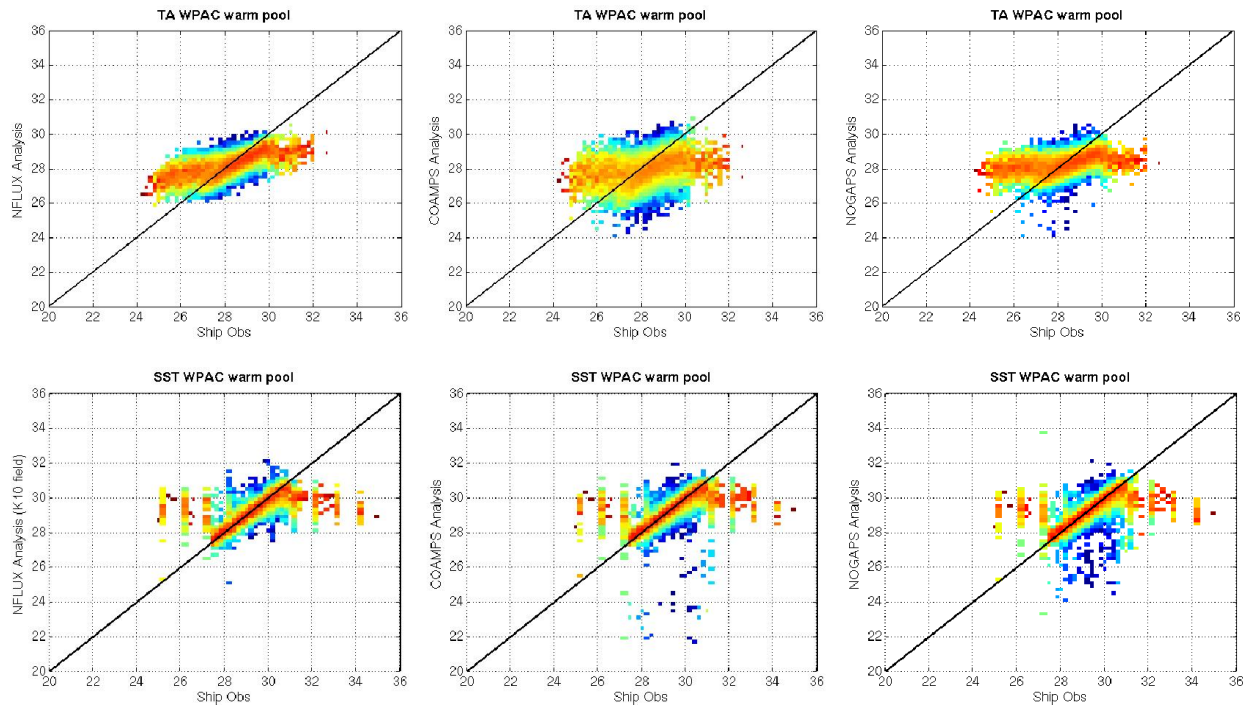


Figure 45: Air temperature and SST over western Pacific warm pool using assimilated *in situ* data. Scatterplots of the *in situ* observations of air temperature (top) and SST (bottom) versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right) are shown.

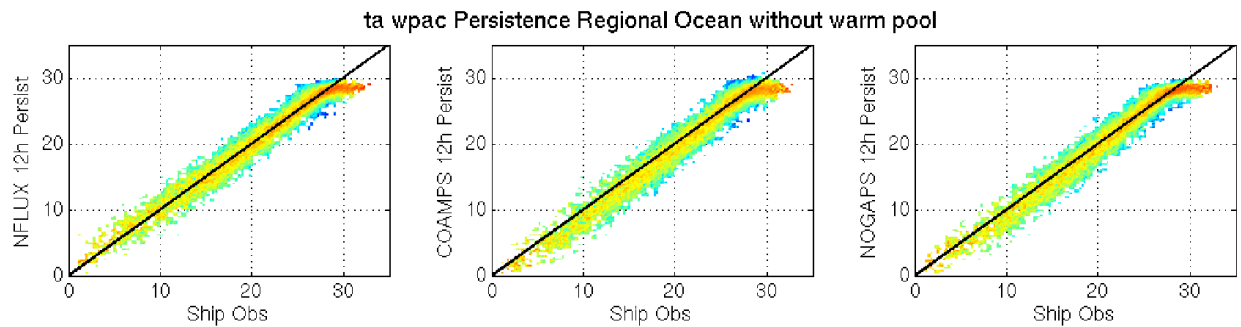


Figure 46: Air temperature over western Pacific open ocean excluding the warm pool using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right) are shown.

5.1.1 Seasonal

The western Pacific open ocean air temperature results by season are shown in Table 18. The corresponding scatterplots of air temperature versus assimilated (unassimilated) *in situ* observations are shown in Figure 47 (Figure 48). As in the regional open ocean, NFLUX consistently outperforms or is not statistically different from COAMPS or NOGAPS using both assimilated and unassimilated matchups. The seasonal scatterplots are for the entire western

Pacific region, including the warm pool. The extended relatively constant temperature feature between 25° and 30°C is seen in each season for each product.

Table 18: Air temperature errors over the western Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|----------|--------|--------|----------------|--------------------|----------|--------|--------|----------------|
| DJF | | | | | N = 13467 | | | | |
| NFLUX Analysis | -0.0494 | 1.0560 | 1.0571 | 0.9801 | NFLUX 12h persist | -0.0324 | 1.3491 | 1.3495 | 0.9672 |
| COAMPS Analysis | -0.7427 | 1.3476 | 1.5386 | 0.9718 | COAMPS 12h persist | -0.7059 | 1.5883 | 1.7380 | 0.9596 |
| COAMPS 12h fcst | -0.7652 | 1.2205 | 1.4405 | 0.9755 | NOGAPS 12h persist | -0.2956 | 1.4667 | 1.4962 | 0.9644 |
| NOGAPS Analysis | -0.3126 | 1.2031 | 1.2430 | 0.9764 | | | | | |
| NOGAPS 12h fcst | -0.2001 | 1.1997 | 1.2162 | 0.9766 | | | | | |
| MAM | | | | | N = 11677 | | | | |
| NFLUX Analysis | -0.1974 | 1.0033 | 1.0225 | 0.9789 | NFLUX 12h persist | -0.2568 | 1.3224 | 1.3470 | 0.9641 |
| COAMPS Analysis | -0.5756 | 1.2566 | 1.3822 | 0.9678 | COAMPS 12h persist | -0.5994 | 1.4742 | 1.5914 | 0.9562 |
| COAMPS 12h fcst | -0.7076 | 1.2172 | 1.4078 | 0.9703 | NOGAPS 12h persist | *-0.2979 | 1.3830 | 1.4147 | 0.9620 |
| NOGAPS Analysis | -0.2722 | 1.1474 | 1.1792 | 0.9737 | | | | | |
| NOGAPS 12h fcst | *-0.2284 | 1.1536 | 1.1760 | 0.9732 | | | | | |
| JJA | | | | | N = 11821 | | | | |
| NFLUX Analysis | -0.1086 | 0.9523 | 0.9584 | 0.9403 | NFLUX 12h persist | -0.1384 | 1.1549 | 1.1631 | 0.9131 |
| COAMPS Analysis | -0.4173 | 1.2467 | 1.3146 | 0.9020 | COAMPS 12h persist | -0.4187 | 1.3120 | 1.3771 | 0.8928 |
| COAMPS 12h fcst | -0.5457 | 1.2005 | 1.3187 | 0.9099 | NOGAPS 12h persist | *-0.1596 | 1.2070 | 1.2174 | 0.9091 |
| NOGAPS Analysis | -0.1476 | 1.1493 | 1.1587 | 0.9166 | | | | | |
| NOGAPS 12h fcst | -0.1490 | 1.1650 | 1.1745 | 0.9144 | | | | | |
| SON | | | | | N = 13218 | | | | |
| NFLUX Analysis | -0.1384 | 0.9351 | 0.9453 | 0.9625 | NFLUX 12h persist | -0.1383 | 1.2092 | 1.2171 | 0.9376 |
| COAMPS Analysis | -0.4249 | 1.2428 | 1.3134 | 0.9383 | COAMPS 12h persist | -0.4076 | 1.3994 | 1.4575 | 0.9220 |
| COAMPS 12h fcst | -0.6070 | 1.1348 | 1.2870 | 0.9470 | NOGAPS 12h persist | -0.1871 | 1.3120 | 1.3252 | 0.9293 |
| NOGAPS Analysis | -0.2047 | 1.1265 | 1.1449 | 0.9477 | | | | | |
| NOGAPS 12h fcst | *-0.1375 | 1.1225 | 1.1308 | 0.9476 | | | | | |

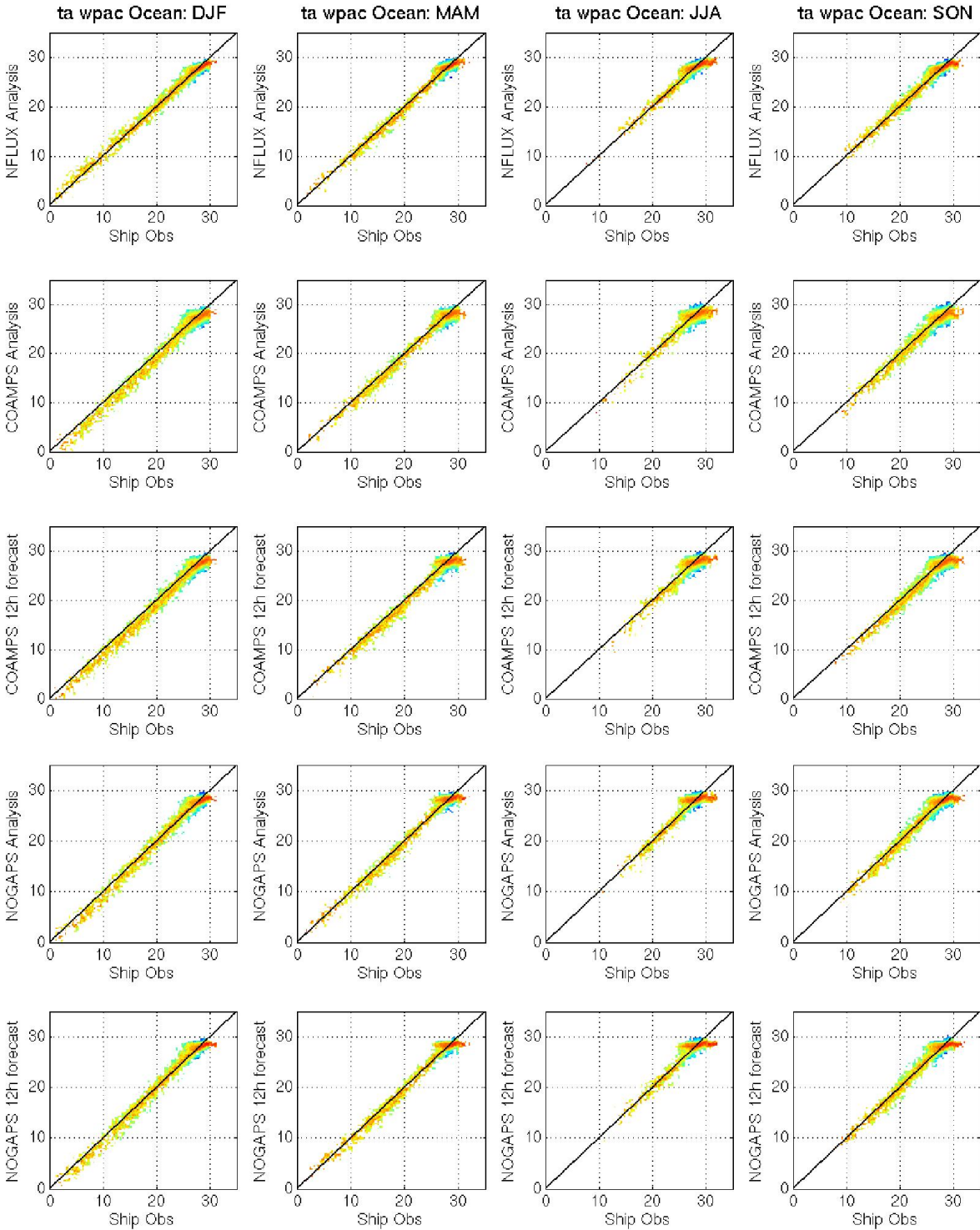


Figure 47: Air temperature over western Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

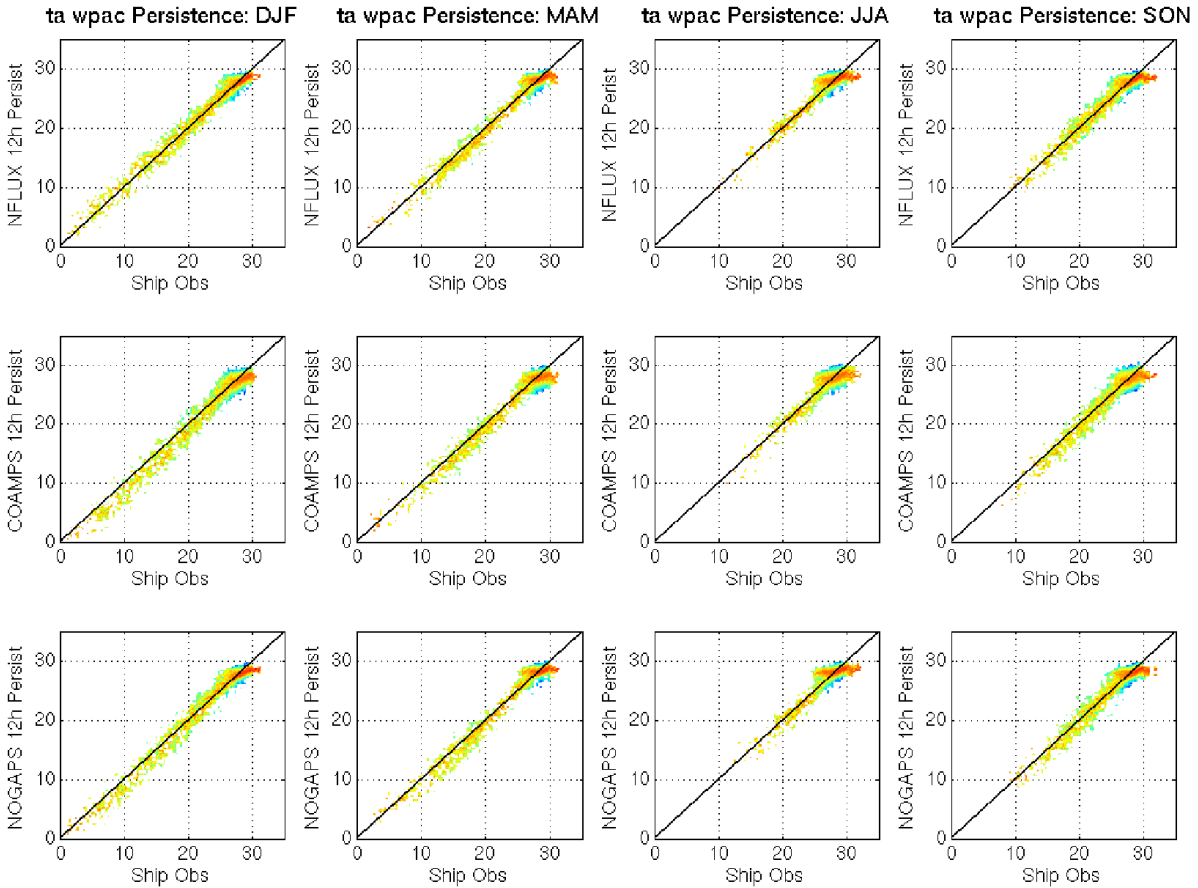


Figure 48: Air temperature over western Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

5.2 Specific Humidity Results

Figure 49 shows mean specific humidity error over the eastern Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left). Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared with the *in situ* matchups, NFLUX shows a moist bias with the most significant differences just north of the equator. NOGAPS and COAMPS show a dry bias throughout the region with the most significant differences along the Kuroshio Current. The annual comparisons of NFLUX versus COAMPS and NOGAPS are very similar with NFLUX being moister over the region with the most noticeable differences along the equator. These differences agree well with the differences seen in the global test case.

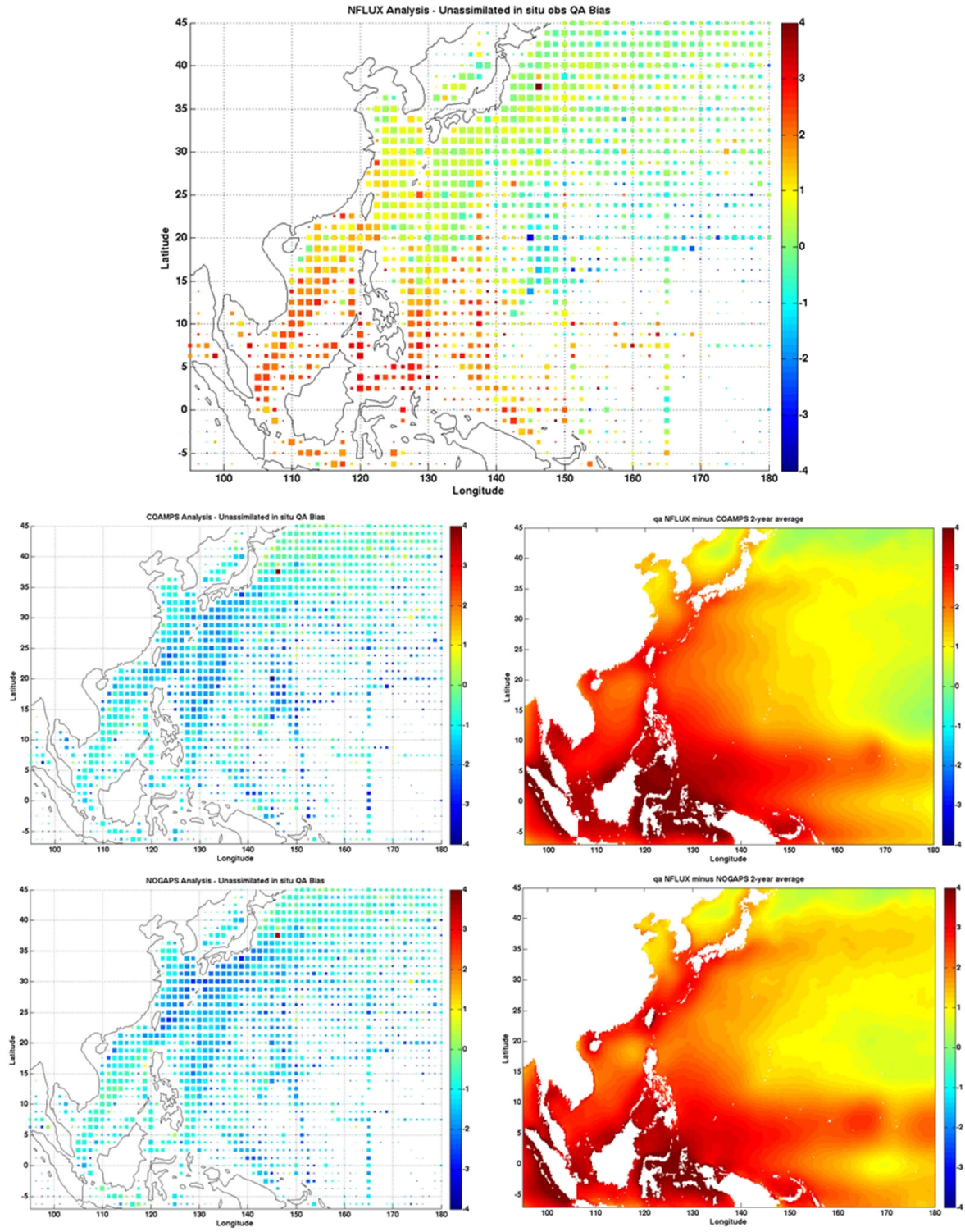


Figure 49: Western Pacific 2-year average specific humidity bias (g/kg). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

The test statistics for specific humidity in the western Pacific are shown in Table 19. Over the open ocean, NFLUX shows a smaller mean bias compared to each of the COAMPS and NOGAPS products, with the exception of the COAMPS 12-hour forecast using assimilated observations. Each of the COAMPS and NOGAPS products outperforms NFLUX in the remaining test statistics using both assimilated and unassimilated observations. Interesting to note is that NFLUX shows a positive mean bias (NFLUX is moister than the observations) while each of the COAMPS and NOGAPS products shows a negative mean bias (COAMPS and NOGAPS are dryer than the observations). This agrees with the mean error shown in Figure 49.

Table 19: Specific humidity errors over the western Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| Regional N = 32046 | | | | | | | | | |
| NFLUX Analysis | 0.9579 | 2.1503 | 2.3540 | 0.8901 | NFLUX 12h persist | 1.0300 | 2.3761 | 2.5897 | 0.8670 |
| COAMPS Analysis | -1.2818 | 1.7345 | 2.1567 | 0.9101 | COAMPS 12h persist | -1.2570 | 1.8834 | 2.2644 | 0.8943 |
| COAMPS 12h fcst | -0.7592 | 1.6295 | 1.7976 | 0.9206 | NOGAPS 12h persist | -1.2584 | 1.8034 | 2.1990 | 0.9047 |
| NOGAPS Analysis | -1.2704 | 1.4995 | 1.9653 | 0.9334 | | | | | |
| NOGAPS 12h fcst | -1.5811 | 1.6436 | 2.2806 | 0.9197 | | | | | |
| Coastal N = 10432 | | | | | | | | | |
| NFLUX Analysis | 1.3136 | 2.1580 | 2.5263 | 0.8973 | NFLUX 12h persist | 1.4096 | 2.3686 | 2.7562 | 0.8777 |
| COAMPS Analysis | -1.4706 | 1.7805 | 2.3093 | 0.9131 | COAMPS 12h persist | -1.4572 | 1.8934 | 2.3891 | 0.9019 |
| COAMPS 12h fcst | -0.9161 | 1.6786 | 1.9122 | 0.9227 | NOGAPS 12h persist | -1.3960 | 1.7894 | 2.2695 | 0.9133 |
| NOGAPS Analysis | -1.4248 | 1.5538 | 2.1081 | 0.9341 | | | | | |
| NOGAPS 12h fcst | -1.6949 | 1.6639 | 2.3751 | 0.9241 | | | | | |
| Ocean N = 21614 | | | | | | | | | |
| NFLUX Analysis | 0.7862 | 2.1255 | 2.2662 | 0.8875 | NFLUX 12h persist | 0.8468 | 2.3579 | 2.5053 | 0.8626 |
| COAMPS Analysis | -1.1906 | 1.7044 | 2.0790 | 0.9091 | COAMPS 12h persist | -1.1604 | 1.8710 | 2.2016 | 0.8910 |
| COAMPS 12h fcst | -0.6835 | 1.5998 | 1.7396 | 0.9200 | NOGAPS 12h persist | -1.1919 | 1.8064 | 2.1642 | 0.9005 |
| NOGAPS Analysis | -1.1958 | 1.4668 | 1.8925 | 0.9335 | | | | | |
| NOGAPS 12h fcst | -1.5262 | 1.6309 | 2.2336 | 0.9177 | | | | | |

Scatterplots of the western Pacific open ocean specific humidity versus assimilated (unassimilated) matchups along with the corresponding histograms of the probability of the mean bias are shown in Figure 50 (Figure 51). As noted in the global test case, NOGAPS showed an upper limit of approximately 20 g/kg even when the *in situ* observations reached 25 g/kg. Both COAMPS and NOGAPS show this same feature in the western Pacific. NFLUX applies a correction to high specific humidity values that eliminates the 20 g/kg capping effect. This creates a larger spread in NFLUX, which increases the standard deviation; however, NFLUX represents a closer one-to-one fit with *in situ* matchups than COAMPS or NOGAPS.

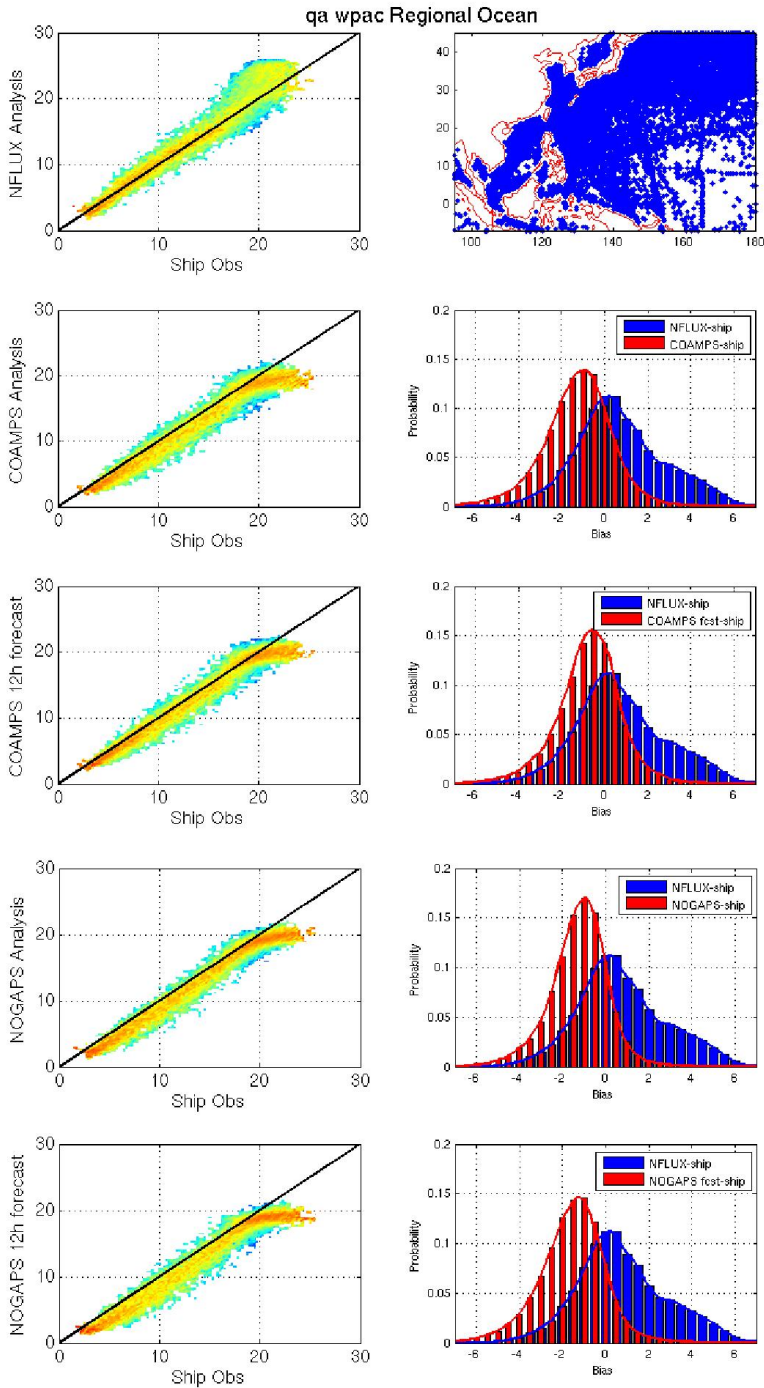


Figure 50: Specific humidity over western Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

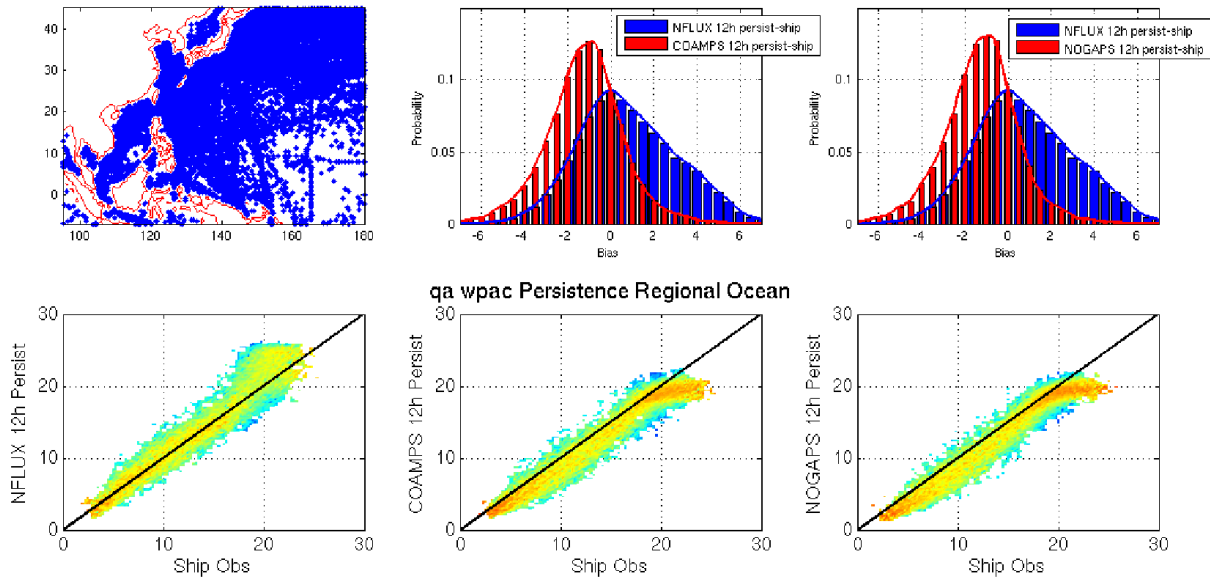


Figure 51: Specific humidity over western Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

5.2.1 Seasonal

The western Pacific open ocean specific humidity results by season are shown in Table 20. The corresponding scatterplots of NFLUX, COAMPS, and NOGAPS compared to assimilated (unassimilated) observations are shown in Figure 52 (Figure 53). Using assimilated observations, NFLUX shows a smaller mean bias in DJF and MAM; however, the COAMPS 12-hour forecast shows a smaller mean bias in JJA and SON. Using unassimilated observations, NFLUX shows a smaller mean bias in each season except JJA. For each of the seasons using both assimilated and unassimilated matchups, NFLUX shows a larger standard deviation, which results in a lower correlation compared to either COAMPS or NOGAPS. The large standard deviation is due to the adjustment at high specific humidity values to remove the capping effect seen in the COAMPS and NOGAPS models.

At high specific humidity values, both COAMPS and NOGAPS display a capping effect. NFLUX applies a correction at high specific humidity values to partially remove this effect. The NFLUX seasonal scatterplots show a more extreme high specific humidity correction than anticipated from the regional open ocean results. Part of this may be attributed to the western Pacific warm pool; however, further investigation is required.

Table 20: Specific humidity errors over the western Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|--------|--------|----------------|--------------------|---------|--------|--------|----------------|
| DJF | | | | | N = 6248 | | | | |
| NFLUX Analysis | 0.4557 | 1.9291 | 1.9821 | 0.9019 | NFLUX 12h persist | 0.5306 | 2.1707 | 2.2344 | 0.8772 |
| COAMPS Analysis | -1.4143 | 1.5866 | 2.1254 | 0.9215 | COAMPS 12h persist | -1.3695 | 1.8143 | 2.2730 | 0.8983 |
| COAMPS 12h fcst | -0.8556 | 1.4884 | 1.7166 | 0.9308 | NOGAPS 12h persist | -1.3699 | 1.7646 | 2.2338 | 0.9082 |
| NOGAPS Analysis | -1.3917 | 1.4160 | 1.9853 | 0.9404 | | | | | |
| NOGAPS 12h fcst | -1.7647 | 1.5481 | 2.3474 | 0.9284 | | | | | |
| MAM | | | | | N = 4515 | | | | |
| NFLUX Analysis | 0.2903 | 2.0172 | 2.0378 | 0.8970 | NFLUX 12h persist | 0.2955 | 2.2715 | 2.2904 | 0.8720 |
| COAMPS Analysis | -0.9958 | 1.7089 | 1.9777 | 0.9168 | COAMPS 12h persist | -1.0093 | 1.8816 | 2.1350 | 0.8987 |
| COAMPS 12h fcst | -0.6557 | 1.6103 | 1.7385 | 0.9260 | NOGAPS 12h persist | -1.0112 | 1.7792 | 2.0463 | 0.9103 |
| NOGAPS Analysis | -0.9886 | 1.4256 | 1.7347 | 0.9419 | | | | | |
| NOGAPS 12h fcst | -1.3204 | 1.5771 | 2.0567 | 0.9288 | | | | | |
| JJA | | | | | N = 4529 | | | | |
| NFLUX Analysis | 1.4014 | 2.1062 | 2.5297 | 0.7965 | NFLUX 12h persist | 1.4910 | 2.2962 | 2.7376 | 0.7647 |
| COAMPS Analysis | -1.0112 | 1.6418 | 1.9281 | 0.8456 | COAMPS 12h persist | -0.9778 | 1.6812 | 1.9448 | 0.8380 |
| COAMPS 12h fcst | -0.5026 | 1.5285 | 1.6088 | 0.8660 | NOGAPS 12h persist | -0.9851 | 1.5873 | 1.8680 | 0.8559 |
| NOGAPS Analysis | -0.9883 | 1.3182 | 1.6474 | 0.9026 | | | | | |
| NOGAPS 12h fcst | -1.2240 | 1.5147 | 1.9473 | 0.8724 | | | | | |
| SON | | | | | N = 6322 | | | | |
| NFLUX Analysis | 1.0264 | 2.2523 | 2.4750 | 0.8519 | NFLUX 12h persist | 1.0917 | 2.4938 | 2.7221 | 0.8173 |
| COAMPS Analysis | -1.2373 | 1.8238 | 2.2037 | 0.8735 | COAMPS 12h persist | -1.1926 | 2.0197 | 2.3453 | 0.8458 |
| COAMPS 12h fcst | -0.6628 | 1.7269 | 1.8496 | 0.8862 | NOGAPS 12h persist | -1.2933 | 1.9797 | 2.3646 | 0.8558 |
| NOGAPS Analysis | -1.2990 | 1.6029 | 2.0631 | 0.9036 | | | | | |
| NOGAPS 12h fcst | -1.6541 | 1.7714 | 2.4235 | 0.8828 | | | | | |

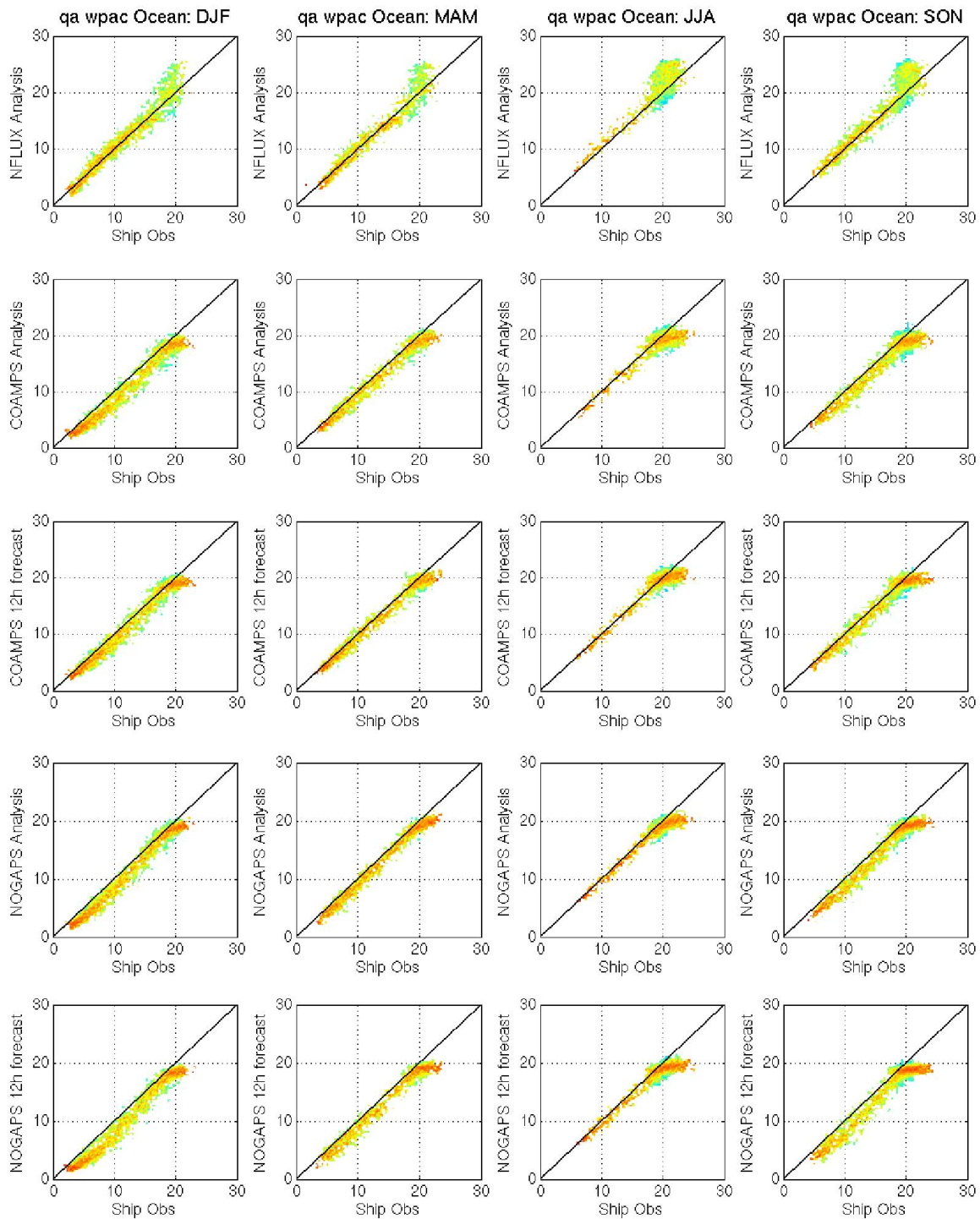


Figure 52: Specific humidity over western Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

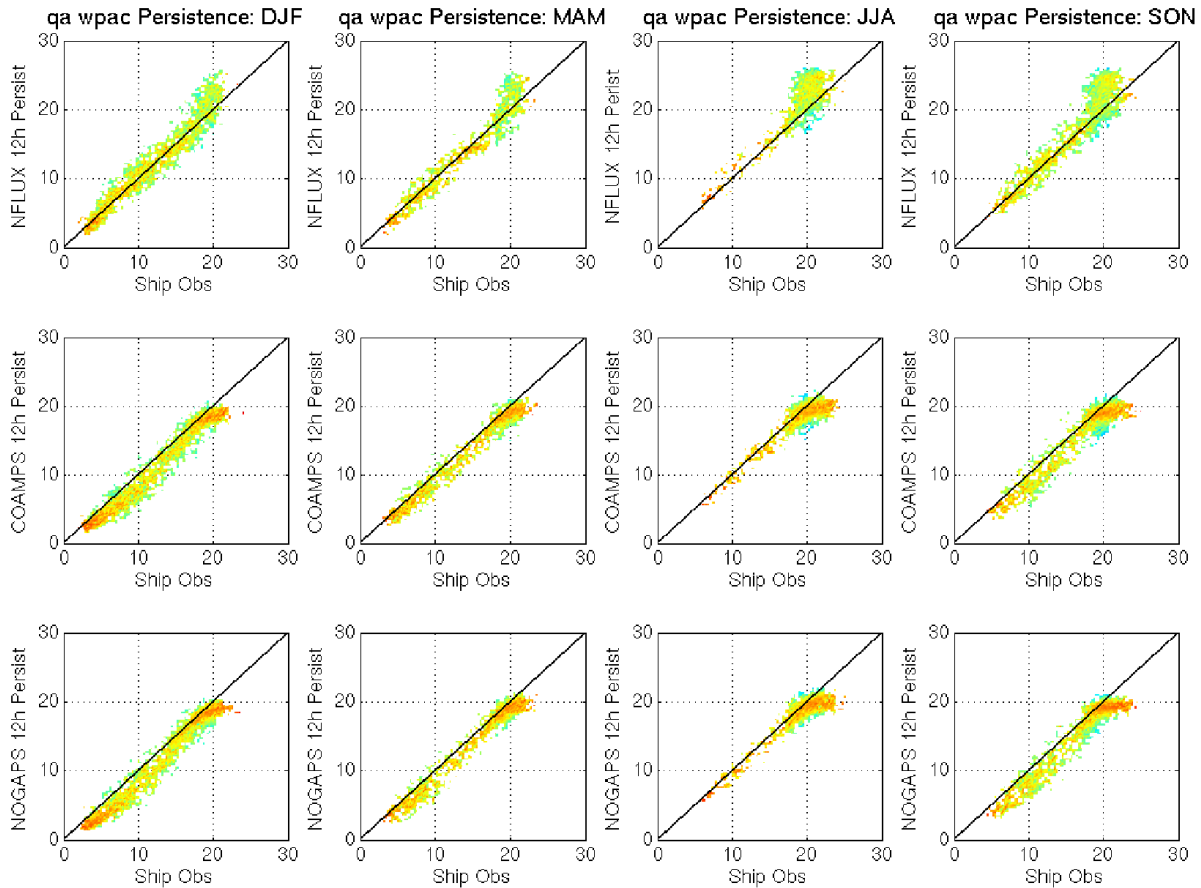


Figure 53: Specific humidity over western Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

5.3 Wind Speed Results

Figure 54 shows mean wind speed error over the eastern Pacific using unassimilated *in situ* observations and NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left). Gridded annual differences are also shown for NFLUX versus COAMPS (middle right) and NOGAPS (bottom right). Compared to *in situ* observations, NFLUX shows an overall high bias throughout the region. COAMPS shows a high bias in the center of the region, with a low bias in the southern and northern areas of the region. NOGAPS shows a general low bias throughout the region. As in the other two test cases, a combination of the low bias, coarse resolution, and smooth coastal topography causes enhanced differences between NOGAPS and NFLUX in the coastal areas.

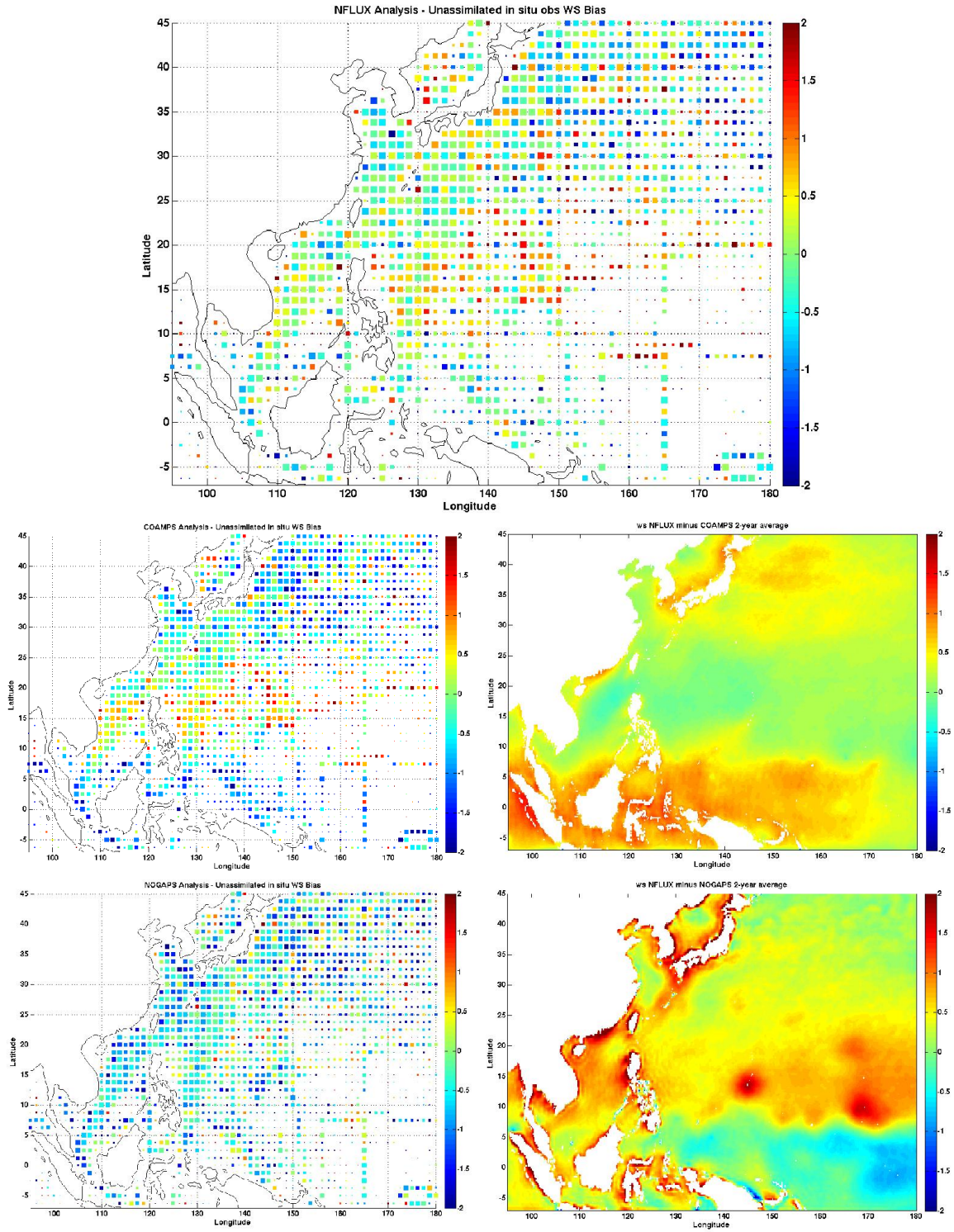


Figure 54: Western Pacific 2-year average wind speed bias (m/s). The NFLUX (top), COAMPS (middle left), and NOGAPS (bottom left) bias compared to unassimilated observations is shown. Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations. The NFLUX minus COAMPS (NOGAPS) air temperature difference is shown in the middle (bottom) right panel.

The wind speed test statistics for the western Pacific are shown in Table 21. For the open ocean, NFLUX shows better or not significantly different statistics compared to both COAMPS and NOGAPS using both assimilated and unassimilated observations. The corresponding scatterplots of wind speed versus assimilated (unassimilated) *in situ* matchups along with the corresponding histograms of the probability of the mean bias are shown in Figure 55 (Figure 56). Each of the model products show a relatively large spread compared to what is seen with air temperature and specific humidity. Each of the products show the high bias at low wind speeds, less than approximately 4 m/s, that was discussed in the global test case.

Table 21: Wind speed errors over the western Pacific Ocean region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| Regional N = 67381 | | | | | | | | | |
| NFLUX Analysis | -0.2956 | 2.5732 | 2.5901 | 0.5852 | NFLUX 12h persist | -0.3044 | 3.3093 | 3.3232 | 0.3528 |
| COAMPS Analysis | -0.8109 | 2.8894 | 3.0010 | 0.4962 | COAMPS 12h persist | -0.8214 | 3.5176 | 3.6122 | 0.3103 |
| COAMPS 12h fcst | -0.8893 | 2.9983 | 3.1273 | 0.4624 | NOGAPS 12h persist | -0.8719 | 3.3800 | 3.4906 | 0.3173 |
| NOGAPS Analysis | -0.8767 | 2.7492 | 2.8856 | 0.5265 | | | | | |
| NOGAPS 12h fcst | -0.7956 | 2.8395 | 2.9488 | 0.4969 | | | | | |
| Coastal N = 20539 | | | | | | | | | |
| NFLUX Analysis | -0.6520 | 3.2231 | 3.2883 | 0.5677 | NFLUX 12h persist | -0.6613 | 4.0973 | 4.1502 | 0.3212 |
| COAMPS Analysis | -1.2629 | 3.5039 | 3.7245 | 0.4877 | COAMPS 12h persist | -1.2795 | 4.2857 | 4.4725 | 0.2758 |
| COAMPS 12h fcst | -1.2360 | 3.5815 | 3.7887 | 0.4662 | NOGAPS 12h persist | -1.7983 | 4.1949 | 4.5640 | 0.2768 |
| NOGAPS Analysis | -1.8074 | 3.5069 | 3.9452 | 0.4903 | | | | | |
| NOGAPS 12h fcst | -1.5694 | 3.5631 | 3.8933 | 0.4699 | | | | | |
| Ocean N = 46842 | | | | | | | | | |
| NFLUX Analysis | -0.1393 | 2.2113 | 2.2157 | 0.6073 | NFLUX 12h persist | -0.1479 | 2.8831 | 2.8868 | 0.3812 |
| COAMPS Analysis | -0.6126 | 2.5490 | 2.6216 | 0.5193 | COAMPS 12h persist | -0.6206 | 3.1006 | 3.1620 | 0.3454 |
| COAMPS 12h fcst | -0.7372 | 2.6891 | 2.7883 | 0.4712 | NOGAPS 12h persist | -0.4657 | *2.8595 | 2.8971 | 0.3799 |
| NOGAPS Analysis | -0.4686 | *2.2212 | 2.2701 | 0.6015 | | | | | |
| NOGAPS 12h fcst | -0.4563 | 2.3777 | 2.4211 | 0.5481 | | | | | |

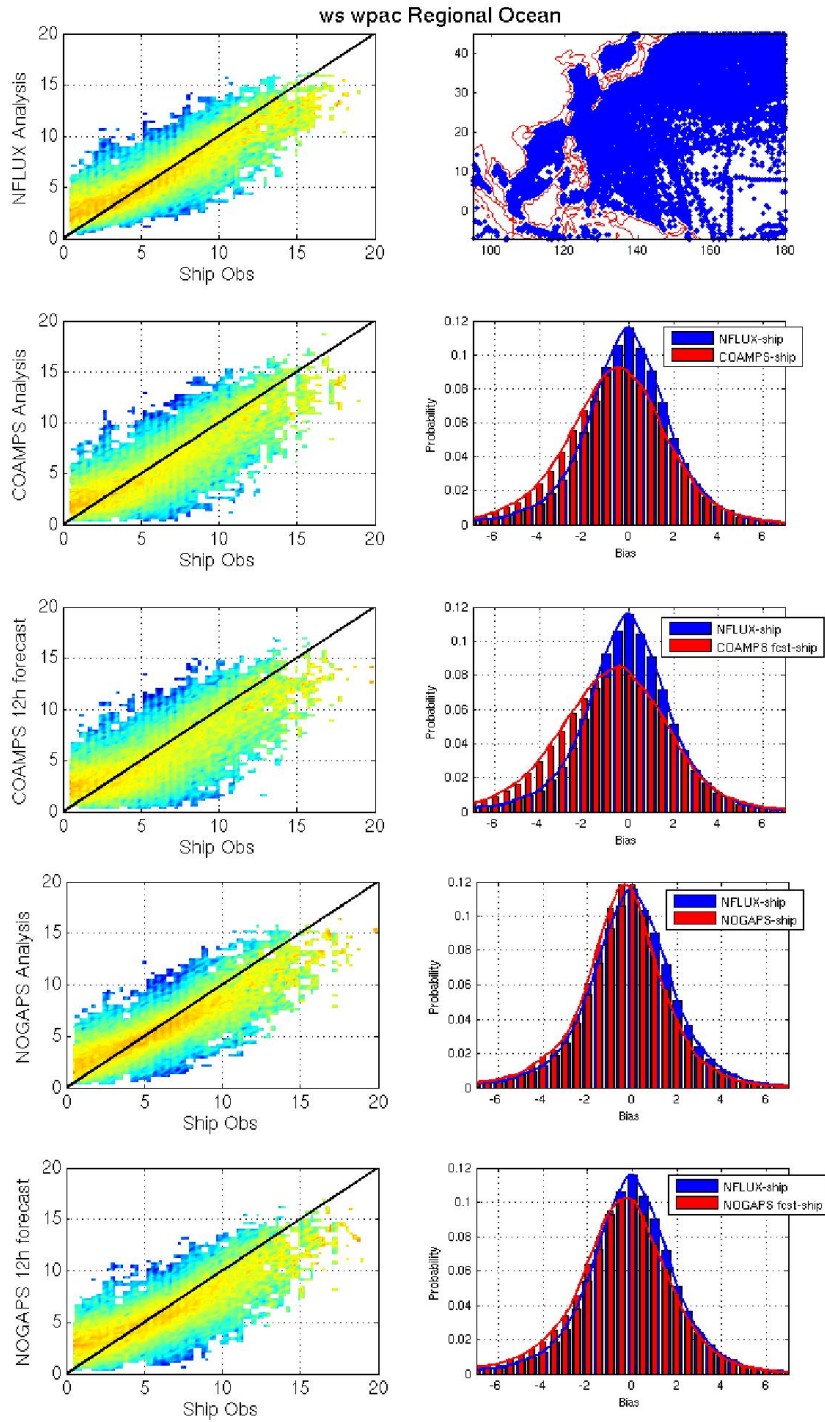


Figure 55: Wind speed over western Pacific open ocean using assimilated *in situ* data. The distribution of the matched up observations is shown in the top right panel. The panels on the left show scatterplots of the *in situ* observations versus NFLUX analysis (top), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom). The right panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

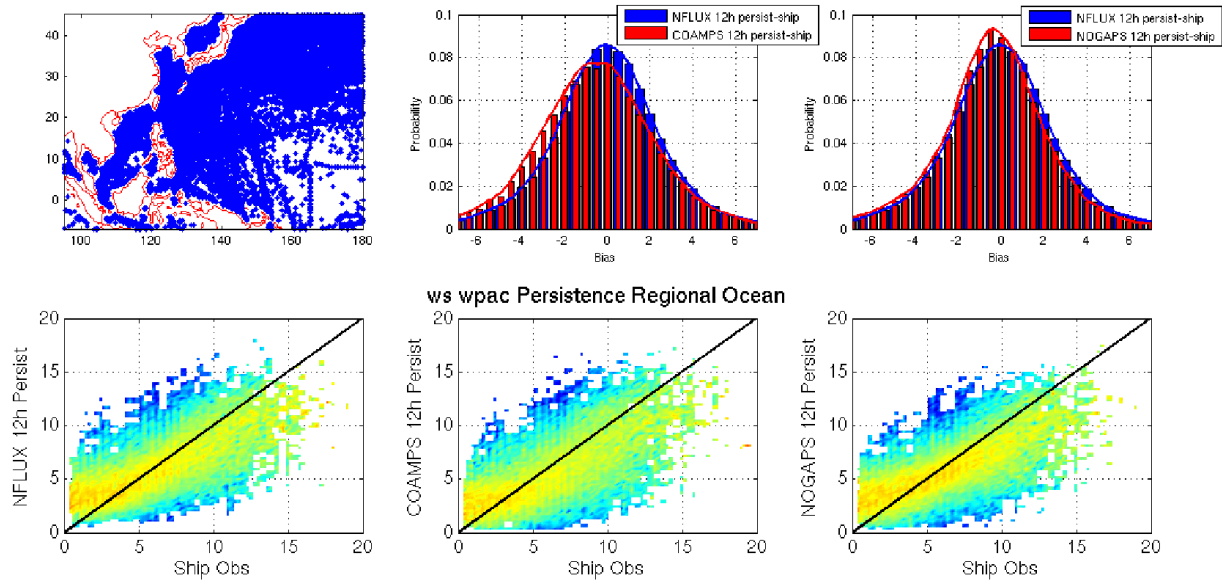


Figure 56: Wind speed over western Pacific open ocean using unassimilated *in situ* data. The distribution of the matched up observations is shown in the top left panel. The panels on the bottom show scatterplots of the *in situ* observations versus NFLUX analysis (left), COAMPS analysis (middle), and NOGAPS analysis (right). The top panels show histograms of the probability of the mean bias of NFLUX analysis (blue) and corresponding COAMPS/NOGAPS model (red).

5.3.1 Seasonal

The open ocean wind speed results in the western Pacific by season are shown in Table 22. The corresponding scatterplots of NFLUX, COAMPS, and NOGAPS compared to assimilated (unassimilated) observations are shown in Figure 57 (Figure 58). The results are similar to those presented for the regional open ocean. Using both assimilated and unassimilated observations, NFLUX shows improvement or no significant difference compared to both COAMPS and NOGAPS.

Table 22: Wind speed errors over the western Pacific open ocean by season. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations. The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | | ME | SD | RMSE | R ² |
|-----------------|---------|---------|--------|----------------|--------------------|---------|---------|--------|----------------|
| DJF | | | | | N = 12298 | | | | |
| NFLUX Analysis | -0.0587 | 2.3676 | 2.3682 | 0.6385 | NFLUX 12h persist | -0.0474 | 3.1725 | 3.1728 | 0.3982 |
| COAMPS Analysis | -0.3981 | 2.7974 | 2.8254 | 0.5309 | COAMPS 12h persist | -0.3882 | 3.4315 | 3.4533 | 0.3511 |
| COAMPS 12h fcst | -0.4914 | 2.9051 | 2.9462 | 0.4974 | NOGAPS 12h persist | -0.4530 | *3.1267 | 3.1592 | 0.4011 |
| NOGAPS Analysis | -0.4729 | *2.3863 | 2.4326 | 0.6307 | | | | | |
| NOGAPS 12h fcst | -0.4097 | 2.5224 | 2.5553 | 0.5895 | | | | | |
| MAM | | | | | N = 10905 | | | | |
| NFLUX Analysis | -0.1156 | 2.1475 | 2.1506 | 0.5967 | NFLUX 12h persist | -0.1392 | 2.9244 | 2.9276 | 0.3190 |
| COAMPS Analysis | -0.7936 | 2.6172 | 2.7347 | 0.4540 | COAMPS 12h persist | -0.8103 | 3.1325 | 3.2354 | 0.2788 |
| COAMPS 12h fcst | -0.8006 | 2.6508 | 2.7690 | 0.4455 | NOGAPS 12h persist | -0.3981 | *2.9116 | 2.9385 | 0.3134 |
| NOGAPS Analysis | -0.3797 | 2.2033 | 2.2357 | 0.5744 | | | | | |
| NOGAPS 12h fcst | -0.3635 | 2.3605 | 2.3882 | 0.5167 | | | | | |
| JJA | | | | | N = 10965 | | | | |
| NFLUX Analysis | -0.2589 | 2.0977 | 2.1135 | 0.4936 | NFLUX 12h persist | -0.2474 | 2.5259 | 2.5379 | 0.3098 |
| COAMPS Analysis | -0.7681 | 2.3033 | 2.4279 | 0.4352 | COAMPS 12h persist | -0.7695 | 2.6965 | 2.8040 | 0.2859 |
| COAMPS 12h fcst | -0.9863 | 2.4924 | 2.6804 | 0.3466 | NOGAPS 12h persist | -0.4493 | *2.5461 | 2.5854 | 0.3017 |
| NOGAPS Analysis | -0.4545 | *2.0909 | 2.1397 | 0.4974 | | | | | |
| NOGAPS 12h fcst | -0.5185 | 2.2699 | 2.3282 | 0.4160 | | | | | |
| SON | | | | | N = 12674 | | | | |
| NFLUX Analysis | -0.1346 | 2.2002 | 2.2042 | 0.5971 | NFLUX 12h persist | -0.1667 | 2.8389 | 2.8437 | 0.3809 |
| COAMPS Analysis | -0.5308 | 2.4164 | 2.4739 | 0.5511 | COAMPS 12h persist | -0.5540 | 3.0441 | 3.0940 | 0.3540 |
| COAMPS 12h fcst | -0.7059 | 2.6461 | 2.7386 | 0.4705 | NOGAPS 12h persist | -0.5503 | *2.7966 | 2.8502 | 0.3870 |
| NOGAPS Analysis | -0.5531 | *2.1764 | 2.2455 | 0.6025 | | | | | |
| NOGAPS 12h fcst | -0.5276 | 2.3352 | 2.3940 | 0.5487 | | | | | |

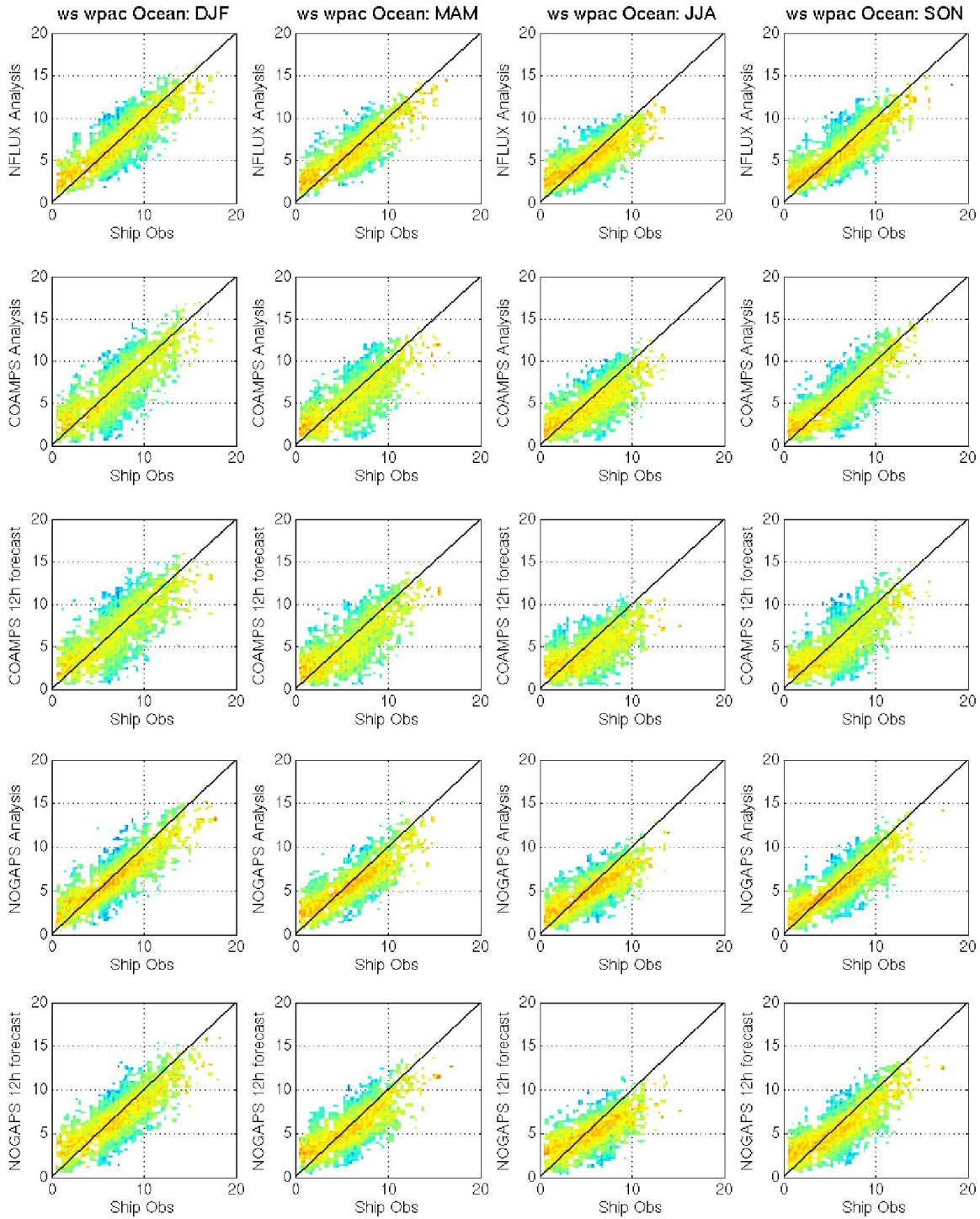


Figure 57: Wind speed over western Pacific open ocean by season using assimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (second row), COAMPS 12-hour forecast (third row), NOGAPS analysis (fourth row), and NOGAPS 12-hour forecast (bottom row) are shown.

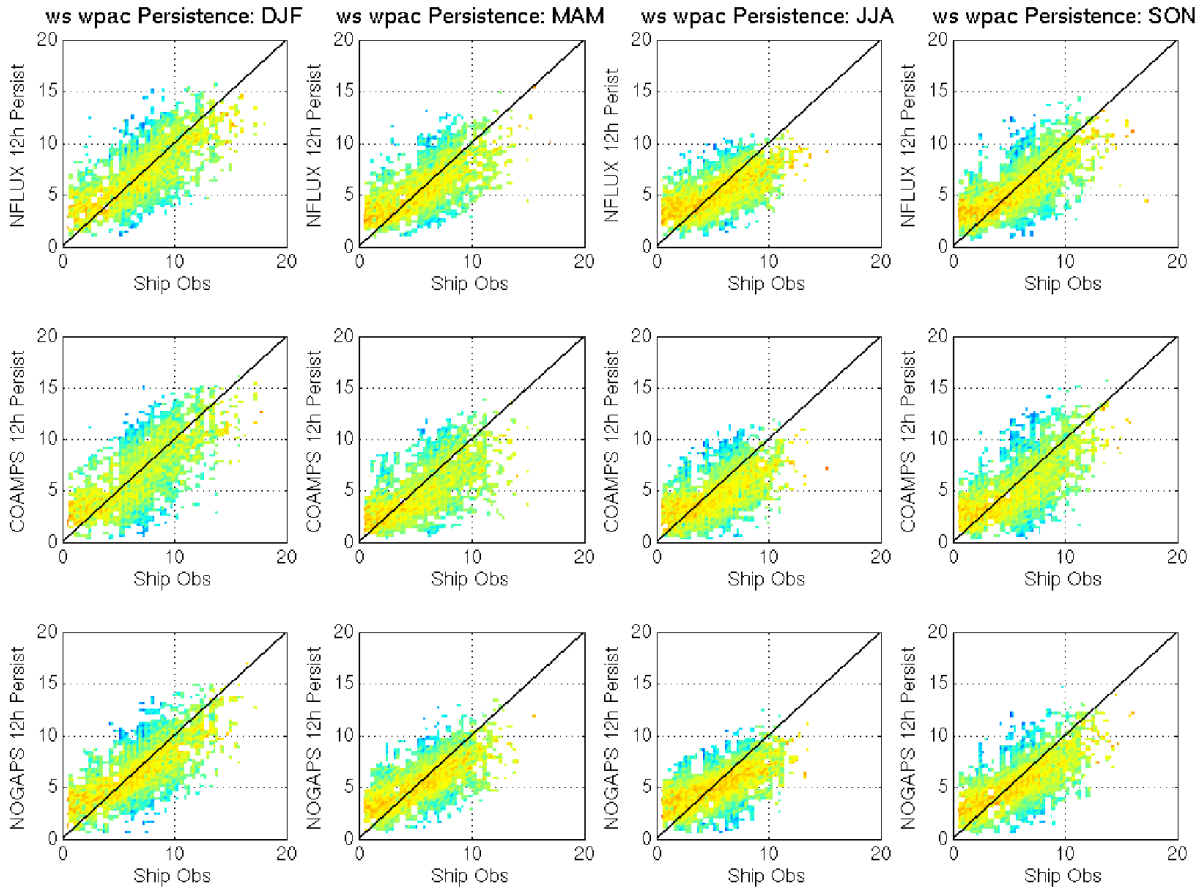


Figure 58: Wind speed over western Pacific open ocean by season using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus NFLUX analysis (top row), COAMPS analysis (middle row), and NOGAPS analysis (bottom row) are shown.

6.0 APPLICATION OF REGION-SPECIFIC RETRIEVALS

The NFLUX version 1 system was built using global satellite retrieval algorithms. Current work with the NFLUX system allows for region-specific retrieval algorithms to be utilized. To demonstrate the capability of region-specific retrievals, four areas of Navy interest were chosen: the California Current System (1), the Arabian Sea (2), the South China Sea (3), and the Okinawa Trough (4). A map outlining the boundaries of each region is shown in Figure 59.

The size of each of these regions was determined based on both the amount of data available for algorithm development and the extent of relatively homogeneous conditions seen in the NFLUX analyses. Each region represents an area with different atmospheric characteristics. The California Current System has an eastern boundary, with NFLUX showing warmer temperatures than NOGAPS. The NFLUX analyses in the Arabian Sea shows similar characteristics to NOGAPS. The South China Sea is in the tropics and represents an area with typical warm and

moist atmospheric conditions. The Okinawa Trough has a western boundary with NFLUX showing higher temperatures and specific humidity values than NOGAPS.

As presented with the global test case, large scale biases can be identified in the air temperature and specific humidity fields (Figure 3 and Figure 11). The global wind speed biases are more random, causing region-specific retrievals difficult to determine. The domains presented here will include new results only for the air temperature and specific humidity fields; wind speed has not been modified.

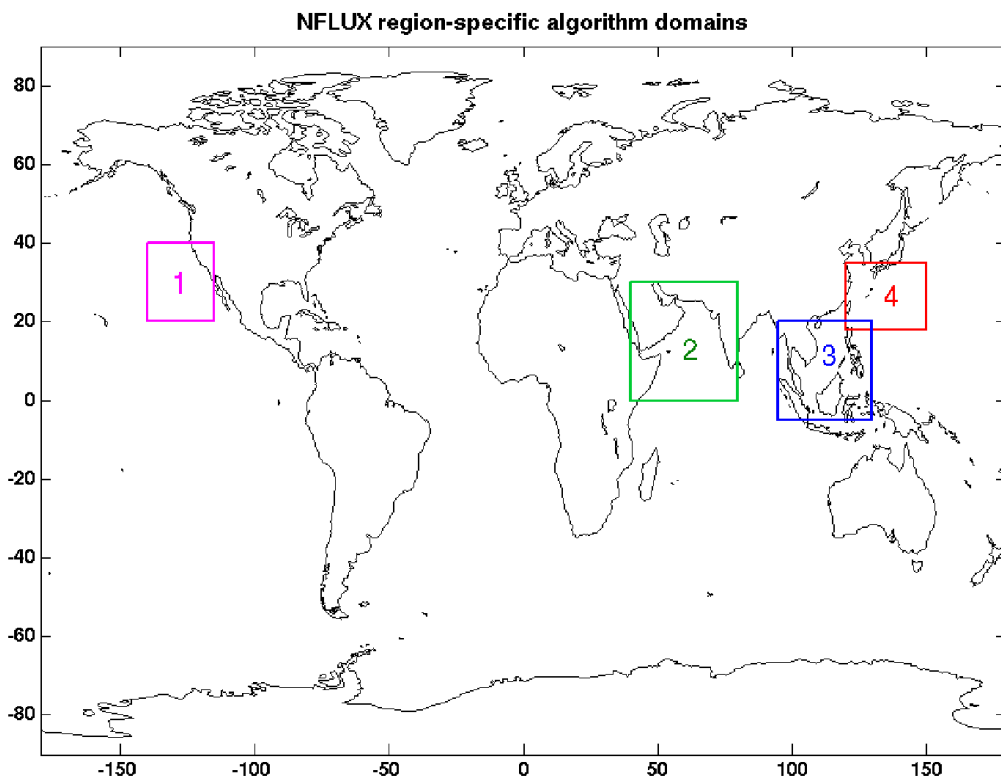


Figure 59: Region-specific satellite retrieval domains. Four regions of interest were chosen to determine performance.

In the Western and Eastern Pacific regional test cases discussed before, COAMPS analysis fields were blended with the previous NFLUX analysis increment field to produce the background fields. In each of the regional test cases, we found NOGAPS had a better comparison with the *in situ* observations than COAMPS. Therefore, for these new modified regions, we use the NOGAPS analysis fields as opposed to the COAMPS analysis fields to form the background fields.

In addition to the four test statistics presented before, an overall skill score (SS) will also be included for each comparison. SS is a non-dimensional quantity based on the correlation coefficient (first term on the right hand side), conditional bias (middle term on the right hand side), and unconditional bias (last term on the right hand side) (Murphy, 1988). The conditional

bias is associated with the differences in the standard deviations and reflects the extent to which the slope of the regression line differs from unity. The unconditional bias is a measure of the difference between the means. A SS of 1.0 is perfect, while a SS of 0.0 is no skill. A positive SS represents improved skill and a negative SS represents reduced skill.

$$SS = R^2 - \left[R - \left(\frac{\sigma_Y}{\sigma_X} \right) \right]^2 - [(\bar{Y} - \bar{X})/\sigma_X]^2, \quad (8)$$

where \bar{X} and σ_X are the mean and standard deviation of the *in situ* observations, \bar{Y} and σ_Y are the mean and standard deviation of the model product, and R is the correlation coefficient.

6.1 California Current System

Figure 60 shows mean air temperature (left) and specific humidity (right) error over the California Current System using unassimilated *in situ* observations and global NFLUX (top), region-specific NFLUX (middle), and NOGAPS (bottom). For the air temperature bias, each of the models shows a similar spatial pattern. For the specific humidity bias, the region-specific NFLUX shows a more negative (dry) bias than the global NFLUX over the central area of the region, while NOGAPS shows an overall dry bias throughout the entire region.

Air temperature and specific humidity test statistics over the California Current System are shown in Table 23 and Table 24 using assimilated and unassimilated *in situ* matchups. The corresponding open ocean scatterplots using unassimilated matchups are shown in Figure 61. The air temperature results for the global and region-specific NFLUX are very similar, with the region-specific retrievals showing a lower ME. However, NOGAPS shows improvement in the other statistics. For specific humidity, the global NFLUX shows improved results over the region-specific NFLUX retrievals and most of the NOGAPS statistics.

In the California Current region, the region-specific retrievals showed similar to worse results compared to the global retrievals. This could be a result of too few observations being used to develop the region-specific algorithms. Over the 2 years, there are 6783 (4584) ship to satellite matchups over the open ocean for air temperature (specific humidity).

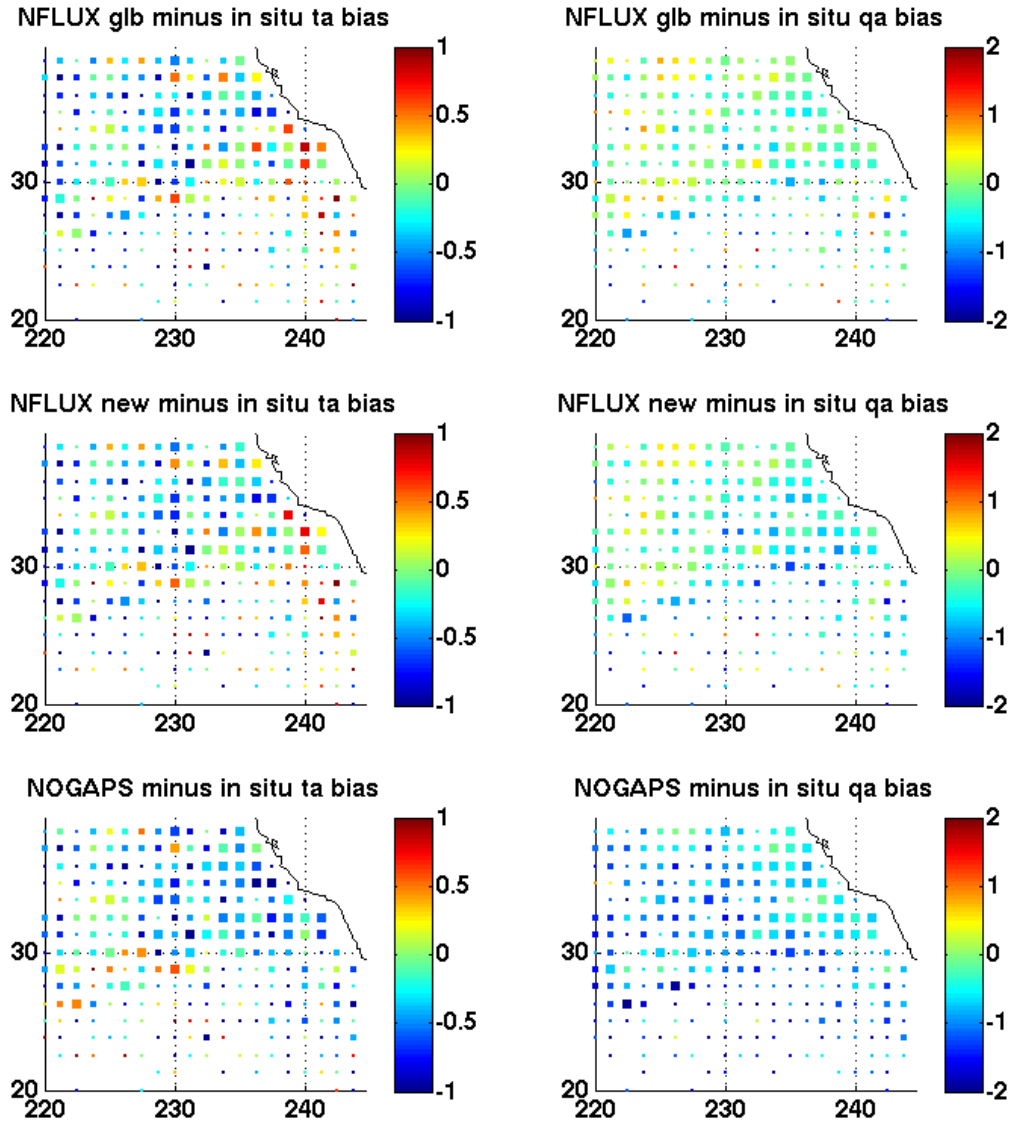


Figure 60: California Current 2-year average air temperature ($^{\circ}\text{C}$) and specific humidity (g/kg) bias. The global NFLUX (top), new regional NFLUX (middle), and NOGAPS (bottom) bias compared to unassimilated observations is shown for both air temperature (left) and specific humidity (right). Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

Table 23: Air temperature errors over the California Current region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------------|---------|--------|--------|----------------|---------|-----------------------|---------|--------|--------|----------------|---------|
| Regional N = 27177 | | | | | | | | | | | |
| NFLUX global | 0.8055 | 2.0000 | 2.1561 | 0.5747 | 0.3537 | NFLUX 12h persist glb | 0.8109 | 2.3622 | 2.4975 | 0.4354 | 0.1329 |
| NFLUX new | 0.6940 | 2.0101 | 2.1265 | 0.5867 | 0.3714 | NFLUX 12h persist new | 0.6973 | 2.4139 | 2.5126 | 0.4326 | 0.1223 |
| NOGAPS Analysis | 0.6619 | 2.3541 | 2.4454 | 0.4855 | 0.1687 | NOGAPS 12h persist | 0.6678 | 2.7554 | 2.8351 | 0.3330 | -0.1175 |
| NOGAPS 12h fcst | 0.8531 | 2.2990 | 2.4522 | 0.4894 | 0.1640 | | | | | | |
| Coastal N = 20394 | | | | | | | | | | | |
| NFLUX global | 1.0468 | 2.1159 | 2.3606 | 0.4737 | -0.2417 | NFLUX 12h persist glb | 1.0549 | 2.5469 | 2.7566 | 0.2770 | -0.6933 |
| NFLUX new | 0.9095 | 2.1476 | 2.3322 | 0.4894 | -0.2120 | NFLUX 12h persist new | 0.9169 | 2.6187 | 2.7745 | 0.2745 | -0.7154 |
| NOGAPS Analysis | 0.9618 | 2.5412 | 2.7170 | 0.3842 | -0.6450 | NOGAPS 12h persist | 0.9686 | 3.0116 | 3.1635 | 0.1826 | -1.2300 |
| NOGAPS 12h fcst | 1.1719 | 2.4695 | 2.7334 | 0.3932 | -0.6648 | | | | | | |
| Ocean N = 6783 | | | | | | | | | | | |
| NFLUX global | 0.0802 | 1.3655 | 1.3678 | 0.7950 | 0.7927 | NFLUX 12h persist glb | 0.0773 | 1.4622 | 1.4641 | 0.7660 | 0.7625 |
| NFLUX new | 0.0461 | 1.3275 | 1.3282 | 0.8063 | 0.8045 | NFLUX 12h persist new | 0.0373 | 1.4655 | 1.4659 | 0.7656 | 0.7619 |
| NOGAPS Analysis | -0.2399 | 1.3060 | 1.3277 | 0.8130 | 0.8047 | NOGAPS 12h persist | -0.2366 | 1.4354 | 1.4547 | 0.7756 | 0.7655 |
| NOGAPS 12h fcst | -0.1053 | 1.2720 | 1.2762 | 0.8209 | 0.8195 | | | | | | |

Table 24: Specific humidity errors over the California Current region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|----------------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional N = 7198 | | | | | | | | | | | |
| NFLUX global | -0.1068 | 1.1917 | 1.1964 | 0.6591 | 0.6139 | NFLUX 12h persist glb | -0.1232 | 1.3359 | 1.3415 | 0.5817 | 0.5146 |
| NFLUX new | -0.2514 | 1.2499 | 1.2749 | 0.6262 | 0.5616 | NFLUX 12h persist new | -0.2680 | 1.3670 | 1.3929 | 0.5600 | 0.4766 |
| NOGAPS Analysis | -0.7642 | 1.0562 | 1.3036 | 0.7176 | 0.5416 | NOGAPS 12h persist | -0.8027 | 1.3418 | 1.5635 | 0.5647 | 0.3407 |
| NOGAPS 12h fcst | -0.9326 | 1.2286 | 1.5424 | 0.6379 | 0.3583 | | | | | | |
| Coastal N = 2614 | | | | | | | | | | | |
| NFLUX global | -0.0606 | 1.1329 | 1.1343 | 0.5751 | 0.4623 | NFLUX 12h persist glb | -0.0814 | 1.2662 | 1.2686 | 0.4943 | 0.3275 |
| NFLUX new | -0.1028 | 1.2048 | 1.2089 | 0.5293 | 0.3892 | NFLUX 12h persist new | -0.0976 | 1.2840 | 1.2875 | 0.4754 | 0.3073 |
| NOGAPS Analysis | -0.6850 | 1.0630 | 1.2645 | 0.5822 | 0.3319 | NOGAPS 12h persist | -0.6814 | 1.2383 | 1.4132 | 0.4604 | 0.1654 |
| NOGAPS 12h fcst | -0.6892 | 1.1115 | 1.3076 | 0.5709 | 0.2855 | | | | | | |
| Ocean N = 4584 | | | | | | | | | | | |
| NFLUX global | -0.1332 | 1.2233 | 1.2304 | 0.6676 | 0.6304 | NFLUX 12h persist glb | -0.1470 | 1.3737 | 1.3813 | 0.5880 | 0.5341 |
| NFLUX new | -0.3362 | 1.2673 | 1.3110 | 0.6458 | 0.5804 | NFLUX 12h persist new | -0.3652 | 1.4030 | 1.4496 | 0.5733 | 0.4869 |
| NOGAPS Analysis | -0.8094 | 1.0497 | 1.3254 | 0.7463 | 0.5711 | NOGAPS 12h persist | -0.8718 | 1.3928 | 1.6430 | 0.5762 | 0.3409 |
| NOGAPS 12h fcst | -1.0714 | 1.2701 | 1.6616 | 0.6532 | 0.3260 | | | | | | |

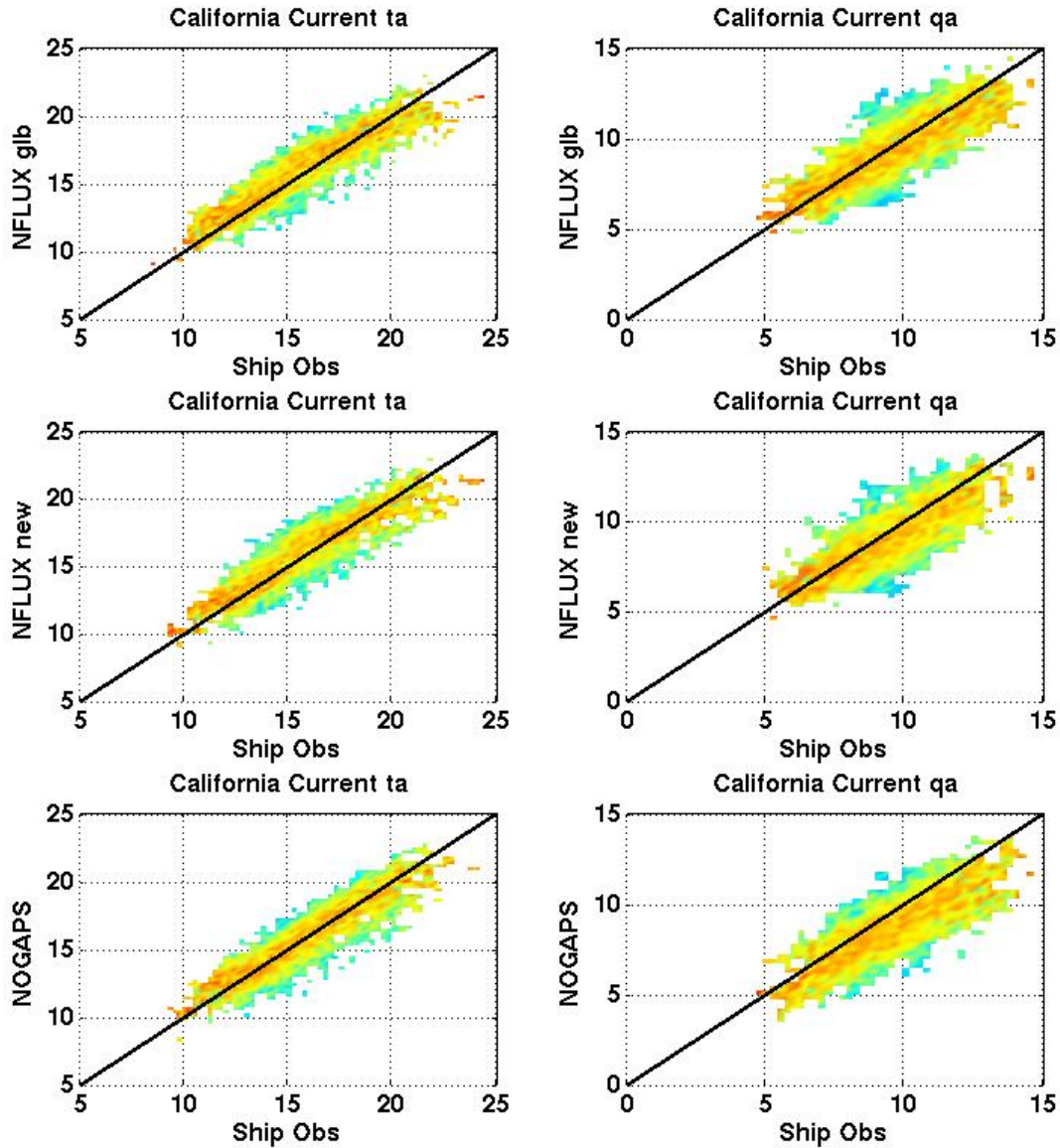


Figure 61: Air temperature and specific humidity over the California Current open ocean region using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus global NFLUX analysis (top), new regional NFLUX analysis (middle), and NOGAPS analysis (bottom) are shown for both air temperature (left) and specific humidity (right).

6.2 Arabian Sea

Figure 62 shows mean air temperature (left) and specific humidity (right) error over the Arabian Sea using unassimilated *in situ* observations and global NFLUX (top), region-specific NFLUX (middle), and NOGAPS (bottom). For the air temperature bias, the region-specific NFLUX shows a near neutral overall bias, while both the global NFLUX and NOGAPS shows a dominantly cold bias. For the specific humidity bias, each of the models shows a similar spatial

pattern with the majority of the region showing a dry bias. The models differ off the western coast of India however. The global and region-specific NFLUX shows a near neutral bias, while NOGAPS continues to show a dry bias.

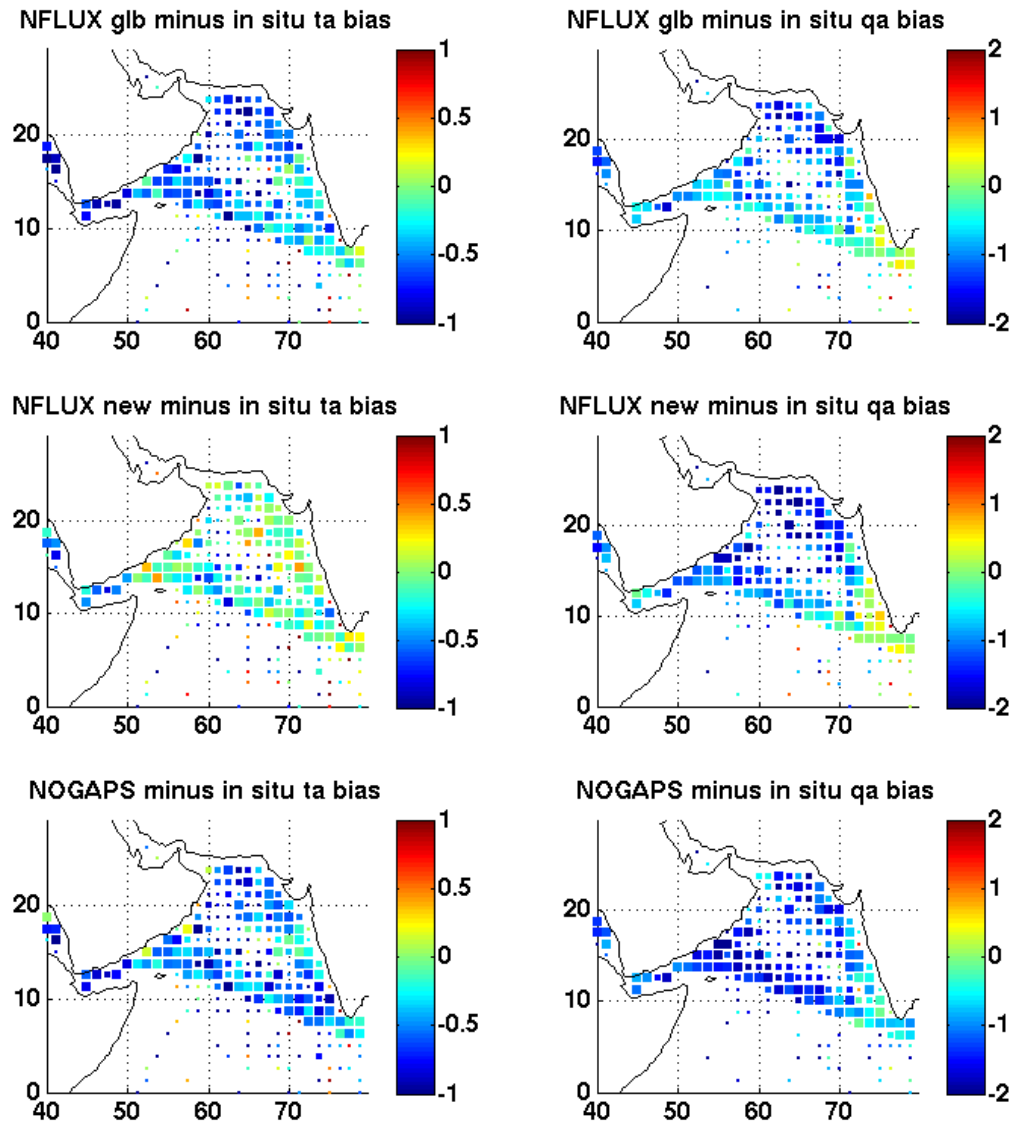


Figure 62: Arabian Sea 2-year average air temperature ($^{\circ}\text{C}$) and specific humidity (g/kg) bias. The global NFLUX (top), new regional NFLUX (middle), and NOGAPS (bottom) bias compared to unassimilated observations is shown for both air temperature (left) and specific humidity (right). Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

Air temperature and specific humidity test statistics over the Arabian Sea are shown in Table 25 and Table 26 using assimilated and unassimilated *in situ* matchups. The corresponding open ocean scatterplots using unassimilated matchups are shown in Figure 63.

Table 25: Air temperature errors over the Arabian Sea region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional | | | | | | Regional | | | | | |
| N = 13133 | | | | | | N = 13133 | | | | | |
| NFLUX global | -0.4646 | 1.5053 | 1.5753 | 0.6840 | 0.6353 | NFLUX 12h persist glb | -0.4873 | 2.1439 | 2.1526 | 0.4503 | 0.3190 |
| NFLUX new | -0.1589 | 1.3353 | 1.3446 | 0.7403 | 0.7343 | NFLUX 12h persist new | -0.1908 | 1.9709 | 1.9800 | 0.4843 | 0.4239 |
| NOGAPS Analysis | -0.4509 | 1.5880 | 1.6507 | 0.6540 | 0.5996 | NOGAPS 12h persist | -0.4634 | 2.1439 | 2.1933 | 0.4292 | 0.2930 |
| NOGAPS 12h fcst | -0.3432 | 1.6058 | 1.6420 | 0.6566 | 0.6038 | | | | | | |
| Coastal | | | | | | Coastal | | | | | |
| N = 4974 | | | | | | N = 4974 | | | | | |
| NFLUX global | -0.4624 | 1.8473 | 1.9041 | 0.7390 | 0.6919 | NFLUX 12h persist glb | -0.5083 | 2.8964 | 2.9404 | 0.4445 | 0.2654 |
| NFLUX new | -0.1947 | 1.5729 | 1.5847 | 0.7966 | 0.7343 | NFLUX 12h persist new | -0.2634 | 2.6711 | 2.6838 | 0.4892 | 0.3880 |
| NOGAPS Analysis | -0.3284 | 1.9776 | 2.0045 | 0.7119 | 0.5996 | NOGAPS 12h persist | -0.3815 | 2.9646 | 2.9887 | 0.4288 | 0.2410 |
| NOGAPS 12h fcst | -0.2167 | 2.0505 | 2.0617 | 0.7077 | 0.6038 | | | | | | |
| Ocean | | | | | | Ocean | | | | | |
| N = 8159 | | | | | | N = 8159 | | | | | |
| NFLUX global | -0.4660 | 1.2519 | 1.3358 | 0.5865 | 0.5278 | NFLUX 12h persist glb | -0.4745 | 1.4011 | 1.4792 | 0.4911 | 0.4209 |
| NFLUX new | -0.1370 | 1.1665 | 1.1744 | 0.6411 | 0.6349 | NFLUX 12h persist new | -0.1466 | 1.3778 | 1.3855 | 0.5005 | 0.4919 |
| NOGAPS Analysis | -0.5256 | 1.2886 | 1.3916 | 0.5609 | 0.4875 | NOGAPS 12h persist | -0.5134 | 1.4265 | 1.5159 | 0.4680 | 0.3918 |
| NOGAPS 12h fcst | -0.4203 | 1.2538 | 1.3223 | 0.5842 | 0.5372 | | | | | | |

Table 26: Specific humidity errors over the Arabian Sea region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional | | | | | | Regional | | | | | |
| N = 10320 | | | | | | N = 10320 | | | | | |
| NFLUX global | -1.0040 | 2.3687 | 2.5726 | 0.5809 | 0.4116 | NFLUX 12h persist glb | -1.0523 | 2.2316 | 2.7910 | 0.5206 | 0.3074 |
| NFLUX new | -1.0655 | 2.2684 | 2.5061 | 0.5809 | 0.4416 | NFLUX 12h persist new | -1.1177 | 2.4570 | 2.6992 | 0.5239 | 0.3522 |
| NOGAPS Analysis | -1.4002 | 1.8933 | 2.3547 | 0.7179 | 0.5070 | NOGAPS 12h persist | -1.4470 | 2.2316 | 2.6595 | 0.6290 | 0.3711 |
| NOGAPS 12h fcst | -1.8687 | 2.2152 | 2.8981 | 0.6255 | 0.2532 | | | | | | |
| Coastal | | | | | | Coastal | | | | | |
| N = 4299 | | | | | | N = 4299 | | | | | |
| NFLUX global | -1.3607 | 2.5730 | 2.9104 | 0.6224 | 0.4594 | NFLUX 12h persist glb | -1.4723 | 2.8964 | 3.2488 | 0.5394 | 0.3263 |
| NFLUX new | -1.3718 | 2.4762 | 2.8306 | 0.6275 | 0.4416 | NFLUX 12h persist new | -1.4549 | 2.6969 | 3.0640 | 0.5685 | 0.4008 |
| NOGAPS Analysis | -1.7430 | 2.2102 | 2.8146 | 0.7322 | 0.5070 | NOGAPS 12h persist | -1.7992 | 2.5426 | 3.1146 | 0.6594 | 0.3809 |
| NOGAPS 12h fcst | -2.2162 | 2.6358 | 3.4435 | 0.6372 | 0.2532 | | | | | | |
| Ocean | | | | | | Ocean | | | | | |
| N = 6021 | | | | | | N = 6021 | | | | | |
| NFLUX global | -0.7494 | 2.1759 | 2.3012 | 0.5352 | 0.3413 | NFLUX 12h persist glb | -0.7524 | 2.2913 | 2.4115 | 0.5039 | 0.2766 |
| NFLUX new | -0.8468 | 2.0803 | 2.2459 | 0.5263 | 0.3726 | NFLUX 12h persist new | -0.8770 | 2.2397 | 2.4051 | 0.4725 | 0.2805 |
| NOGAPS Analysis | -1.1554 | 1.5853 | 1.9615 | 0.7071 | 0.5214 | NOGAPS 12h persist | -1.1955 | 1.9413 | 2.2797 | 0.5912 | 0.3535 |
| NOGAPS 12h fcst | -1.6206 | 1.8175 | 2.4350 | 0.6181 | 0.2625 | | | | | | |

For air temperature, the region-specific NFLUX not only shows improvement in each test statistic over the global NFLUX, but also over NOGAPS. For specific humidity, we see an increase in the ME with the region-specific NFLUX compared to the global NFLUX. The

region-specific NFLUX does show improvement in the remaining test statistics compared to the global NFLUX; however, NOGAPS still outperforms NFLUX.

As shown in the results, the region-specific NFLUX shows a smaller standard deviation compared to the global NFLUX. This can also be seen in the scatterplots shown in Figure 63 (right). As discussed previously, NFLUX applies a correction to high specific humidity values that eliminates the 20 g/kg capping effect seen in NOGAPS. The region-specific NFLUX eliminates much of the noise seen at the high values in the global NFLUX while still maintaining a broad one-to-one relationship. NOGAPS still shows a closer one-to-one fit however.

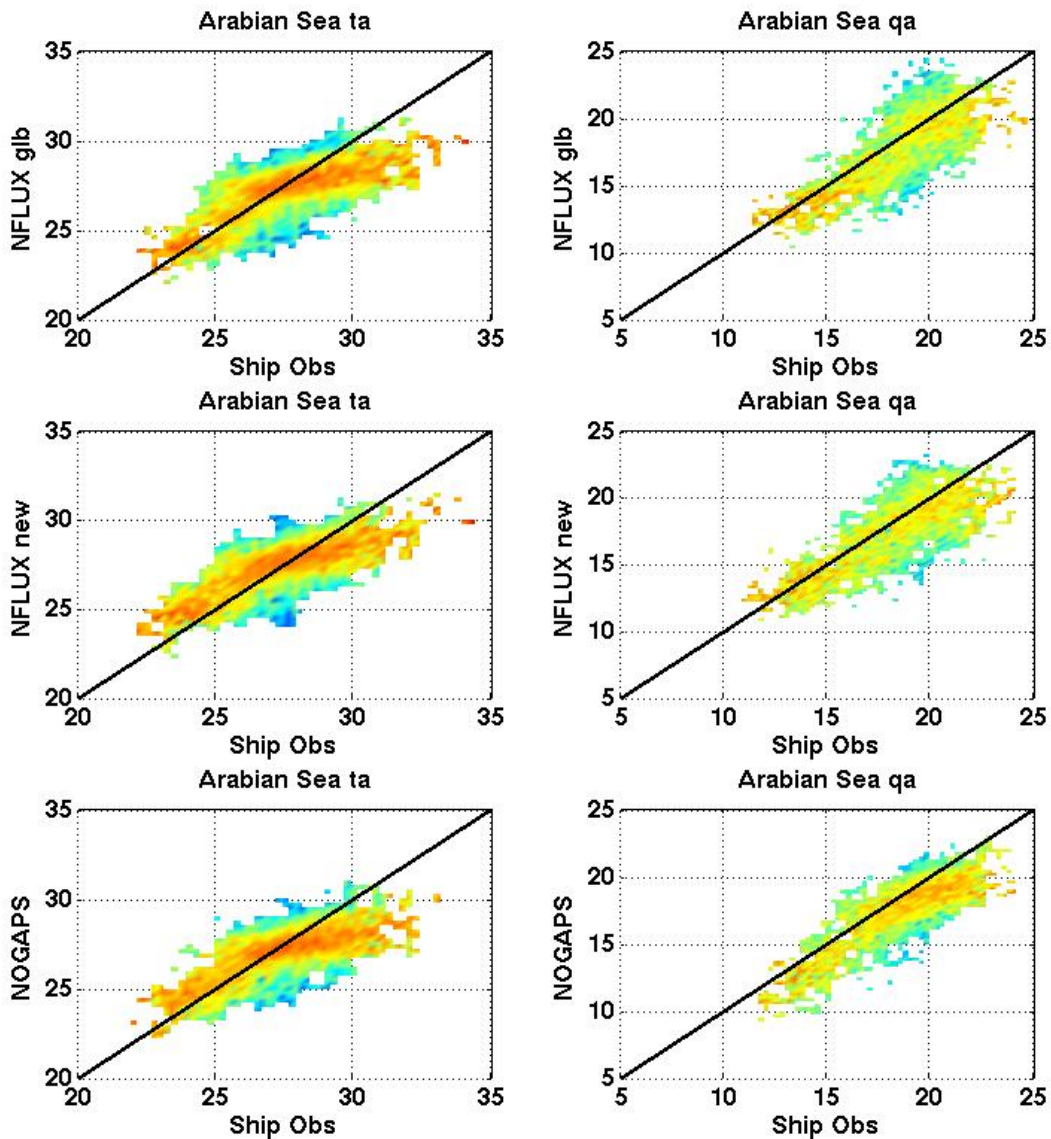


Figure 63: Air temperature and specific humidity over the Arabian Sea open ocean region using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus global NFLUX analysis (top), new regional NFLUX analysis (middle), and NOGAPS analysis (bottom) are shown for both air temperature (left) and specific humidity (right).

6.3 South China Sea

Figure 64 shows mean air temperature (left) and specific humidity (right) error over the South China Sea using unassimilated *in situ* observations and global NFLUX (top), region-specific NFLUX (middle), and NOGAPS (bottom). For the air temperature bias, the global NFLUX shows an overall warm bias, while the region-specific NFLUX and NOGAPS show a near neutral bias. For the specific humidity bias, the global NFLUX shows a strong moist bias. The region-specific NFLUX greatly reduces the global NFLUX bias; however, there is still a moist bias present over most of the region. Unlike NFLUX, NOGAPS shows a strong dry bias throughout the region.

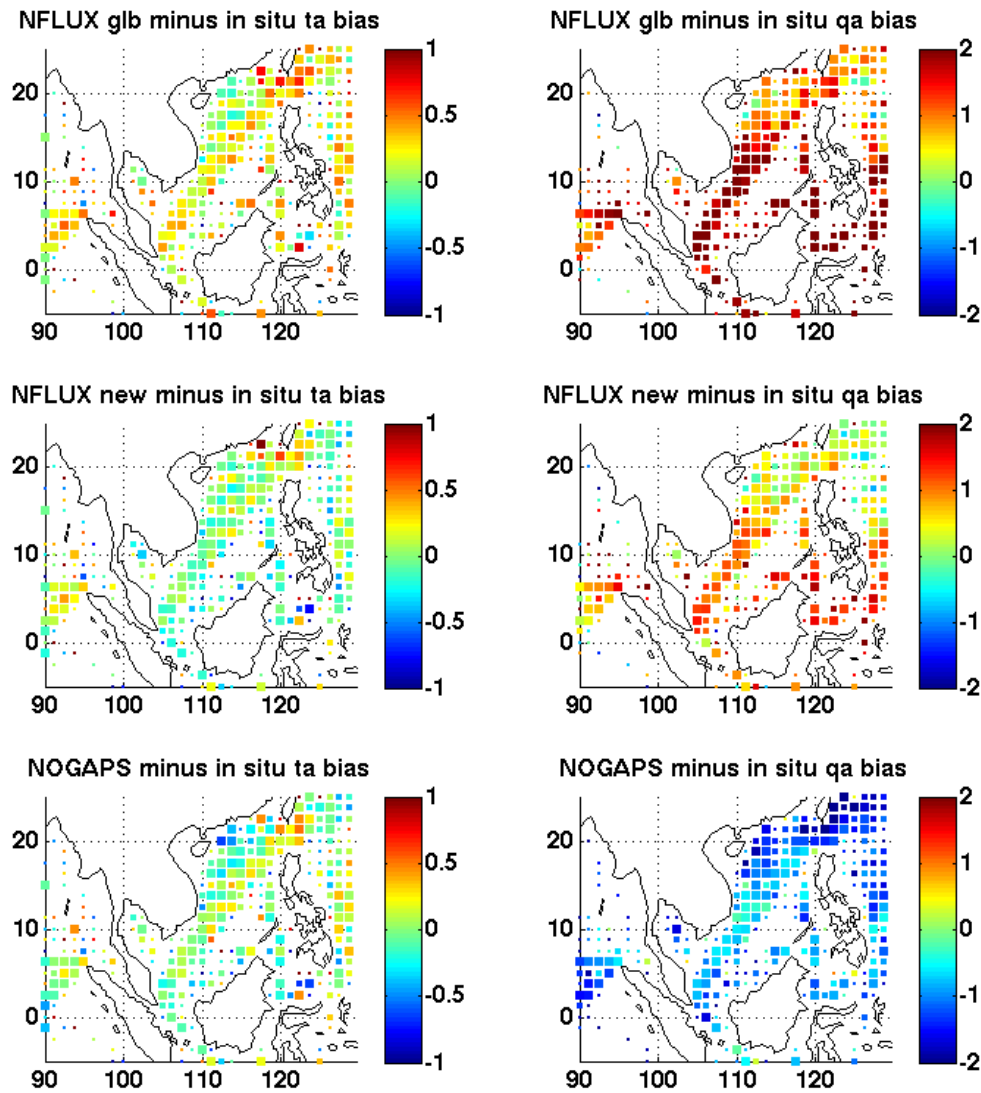


Figure 64: South China Sea 2-year average air temperature (°C) and specific humidity (g/kg) bias. The global NFLUX (top), new regional NFLUX (middle), and NOGAPS (bottom) bias compared to unassimilated observations is shown for both air temperature (left) and specific humidity (right). Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

Air temperature and specific humidity test statistics over the South China Sea are shown in Table 27 and Table 28 using assimilated and unassimilated *in situ* matchups. The corresponding open ocean scatterplots using unassimilated matchups are shown in Figure 65.

Table 27: Air temperature errors over the South China Sea region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional | | | | | | | | | | | |
| N = 18376 | | | | | | | | | | | |
| NFLUX global | 0.1910 | 1.1623 | 1.1779 | 0.8025 | 0.7970 | NFLUX 12h persist glb | 0.2159 | 1.3457 | 1.3281 | 0.7489 | 0.7419 |
| NFLUX new | -0.0323 | 1.0697 | 1.0701 | 0.8362 | 0.8324 | NFLUX 12h persist new | -0.0071 | 1.3007 | 1.3006 | 0.7527 | 0.7524 |
| NOGAPS Analysis | -0.0698 | 1.2295 | 1.2314 | 0.7805 | 0.7781 | NOGAPS 12h persist | -0.0431 | 1.3457 | 1.3464 | 0.7392 | 0.7347 |
| NOGAPS 12h fcst | 0.0069 | 1.2471 | 1.2471 | 0.7737 | 0.7724 | | | | | | |
| Coastal | | | | | | | | | | | |
| N = 6610 | | | | | | | | | | | |
| NFLUX global | 0.2069 | 1.3293 | 1.3452 | 0.8393 | 0.8353 | NFLUX 12h persist glb | 0.2480 | 1.5823 | 1.6015 | 0.7729 | 0.7666 |
| NFLUX new | -0.0463 | 1.2136 | 1.2144 | 0.8700 | 0.8658 | NFLUX 12h persist new | -0.0103 | 1.5695 | 1.5694 | 0.7763 | 0.7759 |
| NOGAPS Analysis | -0.1083 | 1.3790 | 1.3831 | 0.8291 | 0.8259 | NOGAPS 12h persist | -0.0622 | 1.6106 | 1.6117 | 0.7695 | 0.7636 |
| NOGAPS 12h fcst | -0.0051 | 1.4201 | 1.4200 | 0.8188 | 0.8165 | | | | | | |
| Ocean | | | | | | | | | | | |
| N = 11766 | | | | | | | | | | | |
| NFLUX global | 0.1821 | 1.0569 | 1.0725 | 0.7491 | 0.7411 | NFLUX 12h persist glb | 0.1979 | 1.1290 | 1.1462 | 0.7131 | 0.7043 |
| NFLUX new | -0.0245 | 0.9795 | 0.9798 | 0.7874 | 0.7839 | NFLUX 12h persist new | -0.0054 | 1.1218 | 1.1217 | 0.7170 | 0.7168 |
| NOGAPS Analysis | -0.0482 | 1.1363 | 1.1373 | 0.7104 | 0.7088 | NOGAPS 12h persist | -0.0324 | 1.1708 | 1.1712 | 0.6941 | 0.6912 |
| NOGAPS 12h fcst | 0.0137 | 1.1385 | 1.1385 | 0.7087 | 0.7082 | | | | | | |

Table 28: Specific humidity errors over the South China Sea region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|---------|-----------------------|---------|--------|--------|----------------|---------|
| Regional | | | | | | | | | | | |
| N = 14585 | | | | | | | | | | | |
| NFLUX global | 1.5679 | 2.2822 | 2.7688 | 0.5773 | 0.0876 | NFLUX 12h persist glb | 1.6474 | 1.6801 | 2.9268 | 0.535 | -0.0195 |
| NFLUX new | 0.7515 | 1.8345 | 1.9824 | 0.6468 | 0.5323 | NFLUX 12h persist new | 0.8222 | 1.9864 | 2.1498 | 0.5954 | 0.4500 |
| NOGAPS Analysis | -1.1846 | 1.4576 | 1.8782 | 0.7551 | 0.5802 | NOGAPS 12h persist | -1.1402 | 1.6801 | 2.0305 | 0.6833 | 0.5093 |
| NOGAPS 12h fcst | -1.5874 | 1.5713 | 2.2335 | 0.7147 | 0.4063 | | | | | | |
| Coastal | | | | | | | | | | | |
| N = 5922 | | | | | | | | | | | |
| NFLUX global | 1.6429 | 2.2774 | 2.8080 | 0.6269 | 0.2797 | NFLUX 12h persist glb | 1.7278 | 2.4225 | 2.9754 | 0.5853 | 0.1913 |
| NFLUX new | 0.8162 | 1.8901 | 2.0586 | 0.6949 | 0.6128 | NFLUX 12h persist new | 0.9022 | 2.0703 | 2.2582 | 0.6416 | 0.5341 |
| NOGAPS Analysis | -1.3709 | 1.5854 | 2.0958 | 0.7732 | 0.5988 | NOGAPS 12h persist | -1.3131 | 1.8049 | 2.2319 | 0.7115 | 0.5450 |
| NOGAPS 12h fcst | -1.7628 | 1.6825 | 2.4367 | 0.7429 | 0.4576 | | | | | | |
| Ocean | | | | | | | | | | | |
| N = 8663 | | | | | | | | | | | |
| NFLUX global | 1.5166 | 2.2842 | 2.7417 | 0.5393 | -0.1297 | NFLUX 12h persist glb | 1.5925 | 2.4156 | 2.8931 | 0.4967 | -0.2580 |
| NFLUX new | 0.7072 | 1.7943 | 1.9285 | 0.6018 | 0.4410 | NFLUX 12h persist new | 0.7676 | 1.9251 | 2.0724 | 0.5524 | 0.3545 |
| NOGAPS Analysis | -1.0572 | 1.3487 | 1.7137 | 0.7411 | 0.5587 | NOGAPS 12h persist | -1.0221 | 1.5785 | 1.8804 | 0.6573 | 0.4686 |
| NOGAPS 12h fcst | -1.4675 | 1.4787 | 2.0832 | 0.6914 | 0.3478 | | | | | | |

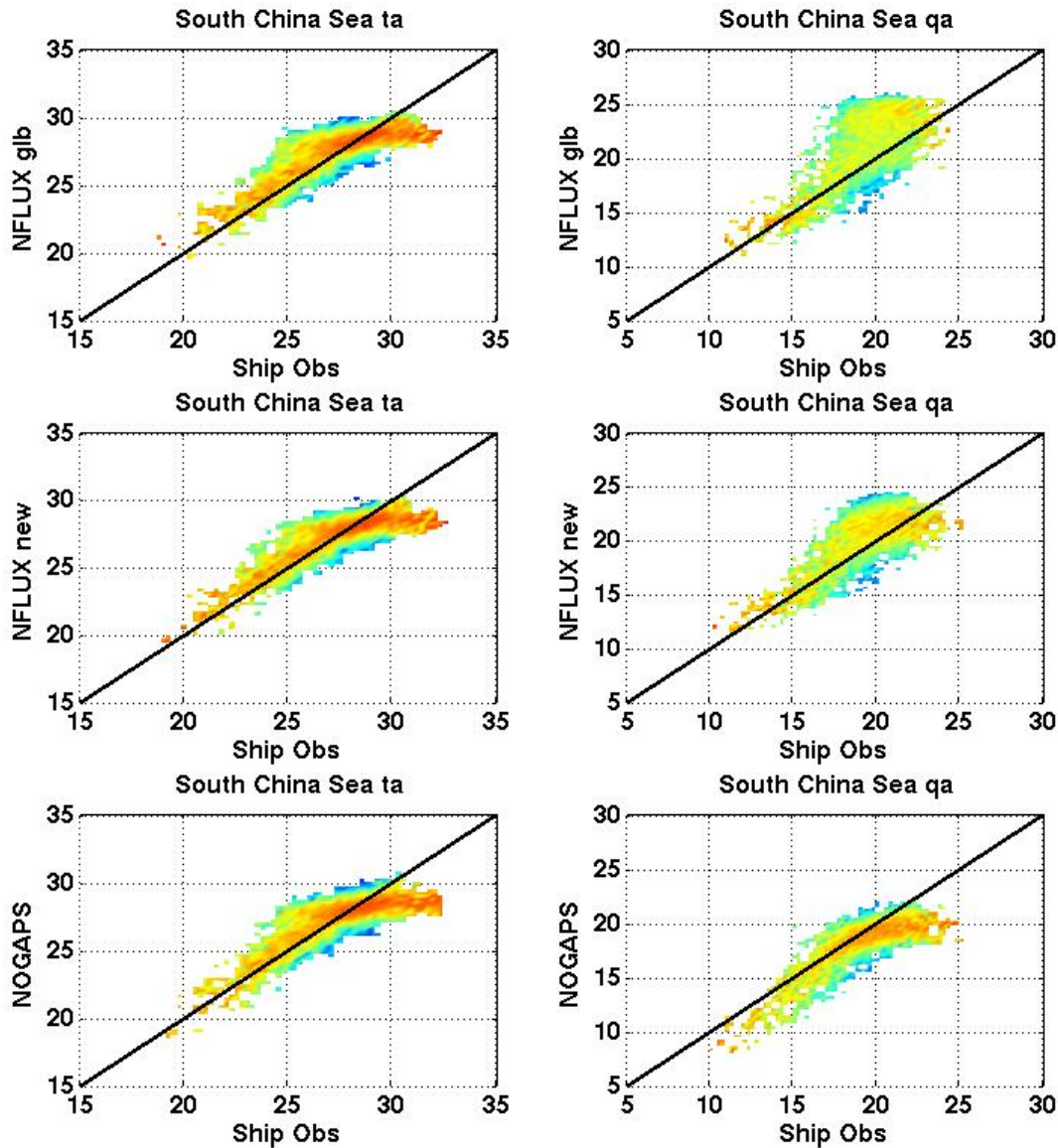


Figure 65: Air temperature and specific humidity over the South China Sea open ocean region using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus global NFLUX analysis (top), new regional NFLUX analysis (middle), and NOGAPS analysis (bottom) are shown for both air temperature (left) and specific humidity (right).

For air temperature, the region-specific NFLUX shows improvement in over both the global NFLUX and NOGAPS for each test statistic with the exception of the ME using assimilated matchups. For specific humidity, the region-specific NFLUX shows a significant improvement over each of the test statistics when compared to the global NFLUX; most notable is the global NFLUX showing a negative SS and the region-specific NFLUX showing positive SS. NOGAPS still shows improvement over the region-specific NFLUX in each test statistic except the ME. By examining the scatterplots in Figure 65, we see a larger scatter at high specific humidity values for the region-specific NFLUX compared to NOGAPS, although the scatter is greatly reduced

from the global NFLUX. This feature has been discussed before as the result of a correction applied to high specific humidity values to eliminate the capping effect seen in NOGAPS around 20 g/kg.

6.4 Okinawa Trough

Figure 66 shows mean air temperature (left) and specific humidity (right) error over the Okinawa Trough using unassimilated *in situ* observations and global NFLUX (top), region-specific NFLUX (middle), and NOGAPS (bottom). The spatial patterns for the air temperature and specific humidity biases are similar for each model: global NFLUX shows an overall warm, moist bias; region-specific NFLUX shows near neutral biases; and NOGAPS shows an overall cold, dry bias.

Air temperature and specific humidity test statistics over the Okinawa Trough are shown in Table 29 and Table 30 using assimilated and unassimilated *in situ* matchups. The corresponding open ocean scatterplots using unassimilated matchups are shown in Figure 67. For air temperature, the region-specific NFLUX shows improvement in over both the global NFLUX and NOGAPS for each test statistic with the exception of the ME. The global NFLUX shows a smaller ME than the region-specific NFLUX; however, the region-specific NFLUX shows a smaller ME than NOGAPS.

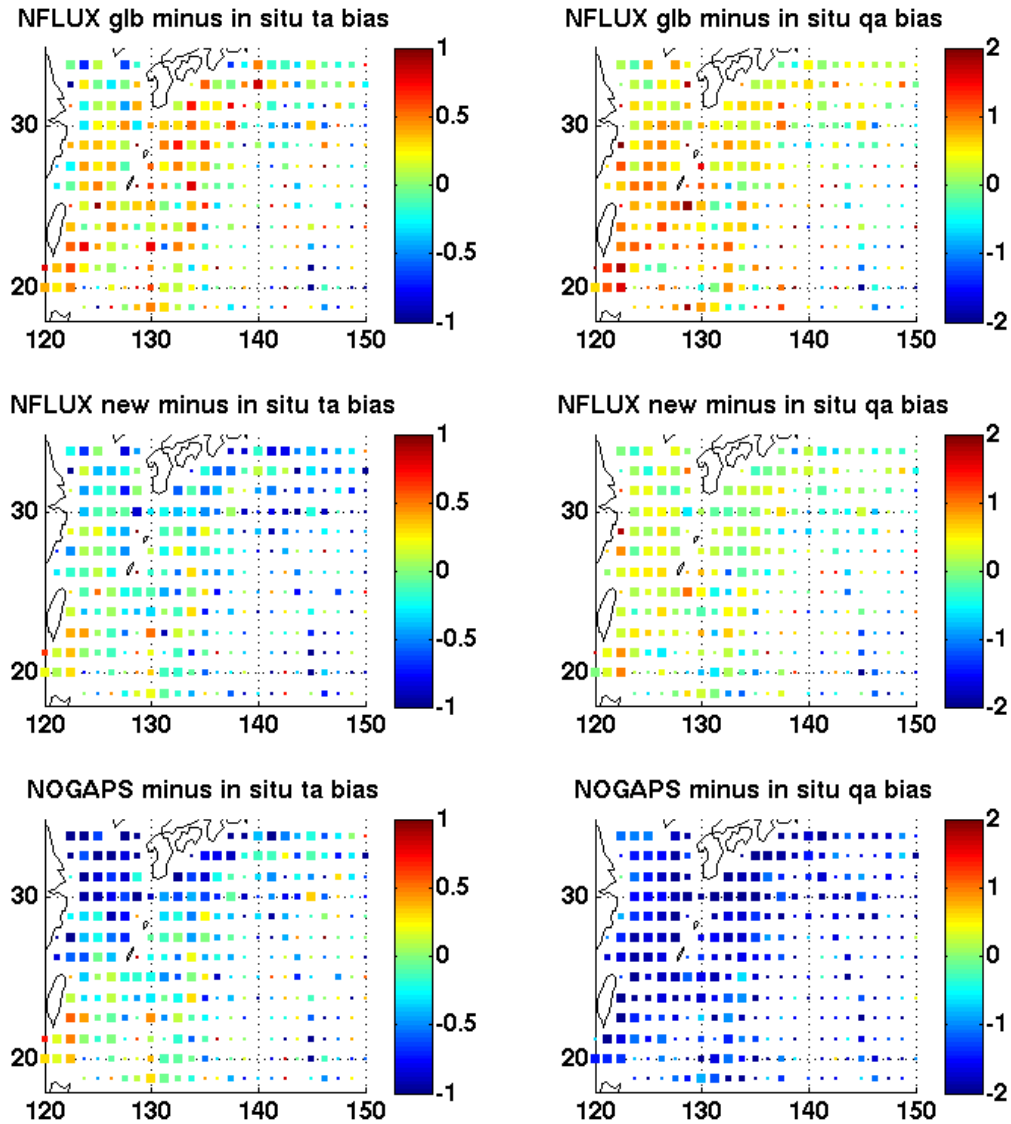


Figure 66: Okinawa Trough 2-year average air temperature ($^{\circ}\text{C}$) and specific humidity (g/kg) bias. The global NFLUX (top), new regional NFLUX (middle), and NOGAPS (bottom) bias compared to unassimilated observations is shown for both air temperature (left) and specific humidity (right). Colored square sizes represent the number of observations in each grid box, ranging from 5 to 50 observations.

Table 29: Air temperature errors over the Okinawa Trough region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional | | | | | | Regional | | | | | |
| N = 16763 | | | | | | N = 16763 | | | | | |
| NFLUX global | 0.1646 | 1.4788 | 1.4879 | 0.9560 | 0.9553 | NFLUX 12h persist glb | 0.1689 | 1.8464 | 1.7854 | 0.9362 | 0.9356 |
| NFLUX new | -0.1196 | 1.2961 | 1.3016 | 0.9661 | 0.9658 | NFLUX 12h persist new | -0.1368 | 1.7113 | 1.7167 | 0.9412 | 0.9404 |
| NOGAPS Analysis | -0.4199 | 1.4710 | 1.5297 | 0.9613 | 0.9527 | NOGAPS 12h persist | -0.4242 | 1.8464 | 1.8944 | 0.9383 | 0.9275 |
| NOGAPS 12h fcst | -0.3942 | 1.4680 | 1.5200 | 0.9605 | 0.9533 | | | | | | |
| Coastal | | | | | | Coastal | | | | | |
| N = 7127 | | | | | | N = 7127 | | | | | |
| NFLUX global | 0.2789 | 1.6187 | 1.6424 | 0.9538 | 0.9523 | NFLUX 12h persist glb | 0.2986 | 2.0267 | 2.0485 | 0.9274 | 0.9258 |
| NFLUX new | 0.0526 | 1.4396 | 1.4405 | 0.9635 | 0.9633 | NFLUX 12h persist new | 0.0492 | 1.9670 | 1.9675 | 0.9326 | 0.9316 |
| NOGAPS Analysis | -0.3969 | 1.6475 | 1.6945 | 0.9577 | 0.9492 | NOGAPS 12h persist | -0.3858 | 2.1327 | 2.1672 | 0.9281 | 0.9170 |
| NOGAPS 12h fcst | -0.3864 | 1.6577 | 1.7021 | 0.9558 | 0.9488 | | | | | | |
| Ocean | | | | | | Ocean | | | | | |
| N = 9396 | | | | | | N = 9396 | | | | | |
| NFLUX global | 0.0800 | 1.3601 | 1.3624 | 0.9460 | 0.9457 | NFLUX 12h persist glb | 0.0729 | 1.5610 | 1.5626 | 0.9288 | 0.9286 |
| NFLUX new | -0.2469 | 1.1625 | 1.1884 | 0.9606 | 0.9587 | NFLUX 12h persist new | -0.2744 | 1.4794 | 1.5045 | 0.9369 | 0.9338 |
| NOGAPS Analysis | -0.4369 | 1.3252 | 1.3953 | 0.9563 | 0.9431 | NOGAPS 12h persist | -0.4526 | 1.6016 | 1.6642 | 0.9354 | 0.9190 |
| NOGAPS 12h fcst | -0.3999 | 1.3102 | 1.3698 | 0.9561 | 0.9451 | | | | | | |

Table 30: Specific humidity errors over the Okinawa Trough region. Errors are shown relative to both assimilated (left columns) and unassimilated (right columns) *in situ* observations for all comparisons (regional), near land (coastal), and open ocean (ocean). The best test statistic in each column is highlighted in blue. Means and standard deviations that are not significantly different compared to NFLUX at the 95% confidence interval are denoted with an asterisk (*).

| | ME | SD | RMSE | R ² | SS | | ME | SD | RMSE | R ² | SS |
|-----------------|---------|--------|--------|----------------|--------|-----------------------|---------|--------|--------|----------------|--------|
| Regional | | | | | | Regional | | | | | |
| N = 9543 | | | | | | N = 9543 | | | | | |
| NFLUX global | 0.5337 | 1.8787 | 1.9529 | 0.8877 | 0.8644 | NFLUX 12h persist glb | 0.5866 | 1.7720 | 2.2053 | 0.8583 | 0.8271 |
| NFLUX new | 0.1193 | 1.6074 | 1.6118 | 0.9084 | 0.9077 | NFLUX 12h persist new | 0.1446 | 1.8706 | 1.8761 | 0.8770 | 0.8749 |
| NOGAPS Analysis | -1.6078 | 1.4586 | 2.1708 | 0.9294 | 0.8325 | NOGAPS 12h persist | -1.6260 | 1.7720 | 2.4049 | 0.8963 | 0.7944 |
| NOGAPS 12h fcst | -1.8846 | 1.6009 | 2.4727 | 0.9164 | 0.7827 | | | | | | |
| Coastal | | | | | | Coastal | | | | | |
| N = 2834 | | | | | | N = 2834 | | | | | |
| NFLUX global | 0.7249 | 1.8018 | 1.9419 | 0.9031 | 0.8746 | NFLUX 12h persist glb | 0.8006 | 2.0828 | 2.2310 | 0.8729 | 0.8345 |
| NFLUX new | 0.3002 | 1.6203 | 1.6476 | 0.9130 | 0.9097 | NFLUX 12h persist new | 0.3558 | 1.8745 | 1.9077 | 0.8847 | 0.8790 |
| NOGAPS Analysis | -1.6412 | 1.5335 | 2.2460 | 0.9242 | 0.8323 | NOGAPS 12h persist | -1.6315 | 1.8113 | 2.4375 | 0.8954 | 0.8024 |
| NOGAPS 12h fcst | -1.7910 | 1.6116 | 2.4092 | 0.9177 | 0.8070 | | | | | | |
| Ocean | | | | | | Ocean | | | | | |
| N = 6709 | | | | | | N = 6709 | | | | | |
| NFLUX global | 0.4529 | 1.9046 | 1.9576 | 0.8771 | 0.8524 | NFLUX 12h persist glb | 0.4962 | 2.1377 | 2.1944 | 0.8472 | 0.8145 |
| NFLUX new | 0.0429 | 1.5959 | 1.5964 | 0.9023 | 0.9018 | NFLUX 12h persist new | 0.0554 | 1.8619 | 1.8625 | 0.8685 | 0.8663 |
| NOGAPS Analysis | -1.5937 | 1.4257 | 2.1383 | 0.9288 | 0.8239 | NOGAPS 12h persist | -1.6237 | 1.7552 | 2.3910 | 0.8920 | 0.7798 |
| NOGAPS 12h fcst | -1.9242 | 1.5948 | 2.4991 | 0.9128 | 0.7594 | | | | | | |

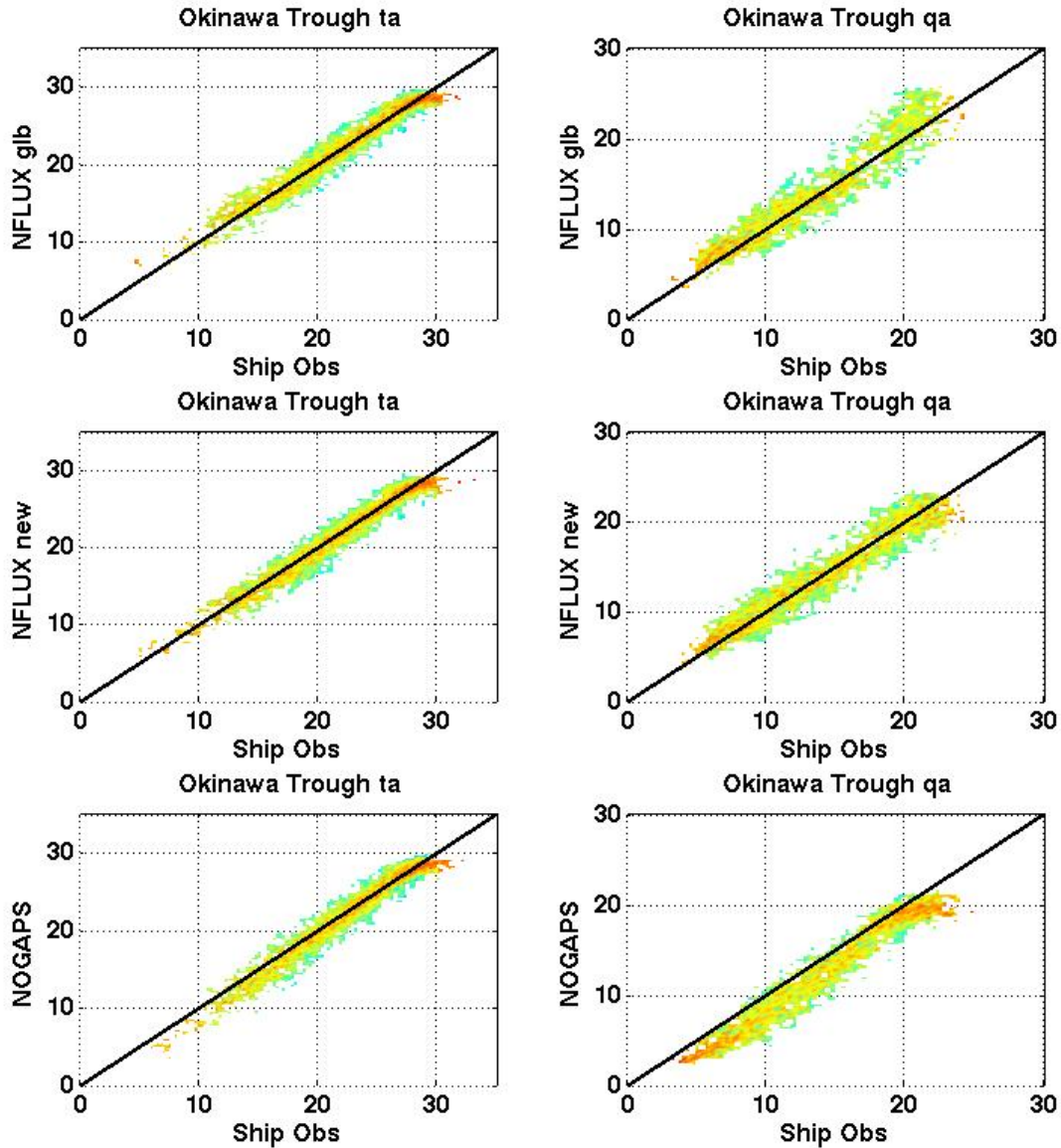


Figure 67: Air temperature and specific humidity over the Okinawa Trough open ocean region using unassimilated *in situ* data. Scatterplots of the *in situ* observations versus global NFLUX analysis (top), new regional NFLUX analysis (middle), and NOGAPS analysis (bottom) are shown for both air temperature (left) and specific humidity (right).

For specific humidity, the region-specific NFLUX shows improvement in the ME and RMSE over both the global NFLUX and NOGAPS. As seen in the scatterplots in Figure 67, the region-specific NFLUX shows a closer one-to-one fit than global NFLUX; however, NOGAPS shows a smaller spread. This results in NOGAPS having a smaller SD and R^2 than the region-specific NFLUX. These combined effects give the region-specific NFLUX a higher SS than NOGAPS.

7.0 CONCLUSION

The validation experiments presented in this report were performed to assess NFLUX in comparison with the current atmospheric models that are used to provide ocean forcing fields. The global test case compared NFLUX to NOGAPS. The western and eastern Pacific regional test cases compared NFLUX to COAMPS as well as NOGAPS. The regional test cases using enhanced region-specific algorithms compared NFLUX to NOGAPS. Each test case was run for two years, from January 1, 2010 through December 31, 2011.

The analysis skill of each of the models was assessed using assimilated as well as unassimilated *in situ* matchup comparisons in terms of the mean error (*ME*), standard deviation (*SD*), root mean square error (RMSE), and correlation coefficient (R^2). The matchups were split into coastal (within 111km of land) and open ocean (greater than 111km of land) data sets, with the focus of this report on the open ocean results. For each of the test cases, the open ocean matchups were examined by season. In addition, the global test case was examined by latitude band.

To summarize the overall performance of NFLUX versus NOGAPS and COAMPS, an overall skill score (SS) was calculated using the unassimilated observation matchups over the open ocean for each of the test cases and each of the surface parameters (Table 31).

Table 31: Skill scores of each of the models using unassimilated *in situ* observations. Skill scores are shown for each of the surface parameters in the global, eastern, and western Pacific test cases for the open ocean.

| | TA | QA | WS |
|-----------------|--------|--------|---------|
| Global - NFLUX | 0.9759 | 0.8746 | 0.2687 |
| Global - NOGAPS | 0.9740 | 0.8874 | 0.2597 |
| EPAC - NFLUX | 0.9194 | 0.7681 | 0.1282 |
| EPAC - COAMPS | 0.8299 | 0.7298 | -0.0079 |
| EPAC - NOGAPS | 0.9144 | 0.7438 | 0.0654 |
| WPAC - NFLUX | 0.9566 | 0.8028 | 0.3233 |
| WPAC - COAMPS | 0.9356 | 0.8477 | 0.1881 |
| WPAC - NOGAPS | 0.9497 | 0.8528 | 0.3184 |

NFLUX shows an improved SS for each test case in air temperature and wind speed. For specific humidity, NFLUX shows an improved skill score only in the eastern Pacific test case. As discussed in each of the test cases for specific humidity, NFLUX generally had a lower mean bias and a larger standard deviation. At high specific humidity values, NOGAPS and COAMPS display a capping effect which does not allow for very high specific humidity values. NFLUX applies a correction in the satellite retrieval process to allow for higher specific humidity values. This creates a closer one-to-one relationship between NFLUX and the *in situ* observations; however, it also creates more spread which means a larger standard deviation and lower correlation.

NFLUX also has the capability to provide region-specific satellite retrievals and assimilation for air temperature and specific humidity. This application was demonstrated for four regions of interest: the California Current System, the Arabian Sea, the South China Sea, and the Okinawa Trough. In the California Current System, the region-specific NFLUX performed similar to or slightly worse than the global NFLUX. One possibility for this may be the limited data set; in general the more observations that are used for the algorithm development, the better the retrievals are. Another possibility is that other atmospheric factors may need to be considered for better retrievals, such as cloud cover. For the other three regions, the region-specific NFLUX showed an improvement over the global NFLUX, with the most noticeable improvement in the specific humidity over the South China Sea.

8.0 REFERENCES

- Cravatte, S., T. Delcroix, D. Zhang, M. J. McPhaden, and J. Leloup, 2009: Observed freshening and warming of the western Pacific Warm Pool, *Clim. Dyn.*, **33**, 565–589, doi:10.1007/s00382-009-0526-7.
- Cummings, J.A., 2005: Operational multivariate ocean data assimilation. *Quart. J. Royal Met. Soc.*, Part C, **131**(613): 3583:3604.
- Curry, J. A., and Coauthors, 2004: SEAFLUX. *Bull. Amer. Meteor. Soc.*, **85**, 409–424. doi: <http://dx.doi.org/10.1175/BAMS-85-3-409>.
- Dayem, K. E., D. C. Noone, and P. Molnar, 2007: Tropical western Pacific warm pool and maritime continent precipitation rates and their contrasting relationships with the Walker Circulation, *J. Geophys. Res.*, **112**, D06101, doi:10.1029/2006JD007870.
- Fairall, C. W., E. F. Bradley, J. E. Hare, A. A. Grachev, and J. B. Edson, 2003: Bulk parameterization of air-sea fluxes: Updates and verification for the COARE algorithm, *J. Climate*, **16**, 571-591.
- Graham, N. E. and H. F. Diaz, 2001: Evidence for intensification of North Pacific winter cyclones since 1948. *Bull. Amer. Meteor. Soc.*, **82**, 1869–1893.
- Hodur, R. M., 1997: The Naval Research Laboratory's Coupled Ocean/Atmosphere Mesoscale Prediction System (COAMPS). *Mon. Wea. Rev.*, **125**, 1414–1430. doi: [http://dx.doi.org/10.1175/1520-0493\(1997\)125<1414:TNRLSC>2.0.CO;2](http://dx.doi.org/10.1175/1520-0493(1997)125<1414:TNRLSC>2.0.CO;2)
- Hogan, T. F. and T. E. Rosmond, 1991: The description of the navy operational global atmospheric prediction system's spectral forecast model. *Mon. Wea. Rev.*, **119**, 1786–1815.
- Kent, E. C., S. D. Woodruff, and D. I. Berry, 2007: Metadata from WMO Publication No. 47 and an Assessment of Voluntary Observing Ship Observation Heights in ICOADS. *J. Atmos. Oceanic Technol.*, **24**, 214–234. doi: <http://dx.doi.org/10.1175/JTECH1949.1>
- Klein, S. A., and D. L. Hartmann, 1993: The seasonal cycle of low stratiform clouds. *J. Climate*, **6**, 1587–1606.
- Murphy, A.H., 1988: Skill scores based on the mean square error and their relationships to the correlation coefficient. *Mon. Wea. Rev.*, **116**, 2417-2424.
- Murphy, A.H., 1995: The Coefficients of Correlation and Determination as Measures of performance in Forecast Verification. *Wea. Forecasting*, **10**, 681–688.
- Rosmond, T. and L. Xu, 2006: Development of NAVDAS-AR: non-linear formulation and outer loop tests. *Tellus*, 58A, 45-58.

WMO, 2006: *Guide to Meteorological Instruments and Methods of Observation*, Preliminary Seventh edition WMO-No. 8, World Meteorological Organization, Geneva, Switzerland.

Xu, H., M. Xu, S.-P. Xie, Y. Wang, 2011: Deep Atmospheric Response to the Spring Kuroshio over the East China Sea*. *J. Climate*, **24**, 4959–4972. doi: <http://dx.doi.org/10.1175/JCLI-D-10-05034.1>

Xu, L., T. Rosmond and R. Daley, 2005: Development of NAVDAS-AR: formulation and initial tests of the linear problem. *Tellus*, **57A**, 546-559.

9.0 ACRONYMS

| | |
|----------|---|
| AMSU | Advanced Microwave Sounding Unit |
| COAMPS | Coupled Ocean Atmosphere Prediction System |
| DJF | December-January-February |
| DoD | Department of Defense |
| DMSP | DoD Meteorological Satellite Program |
| EUMETSAT | European Organization for the Exploitation of Meteorological Satellites |
| JJA | June-July-August |
| MAM | March-April-May |
| ME | Mean Error |
| NCODA | Navy Coastal Ocean Data Assimilation |
| NFLUX | NRL Ocean Surface Flux |
| NOAA | National Oceanic and Atmospheric Administration |
| NOGAPS | Navy Operational Global Atmospheric Prediction System |
| NRL | Naval Research Laboratory |
| QC | Quality Control |
| R^2 | Correlation Coefficient |
| RMSE | Root Mean Square Error |
| SD | Standard Deviation |
| SON | September-October-November |
| SS | Skill Score |
| SSMIS | Special Sensor Microwave Imager/Sounder |
| SST | Sea Surface Temperature |
| VOS | Voluntary Observing Ships |

