

Sensitivity of Ocean Surface Salinity Measurements From Spaceborne L-Band Radiometers to Ancillary Sea Surface Temperature

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Abstract—Sea surface temperature (SST) serves as a crucial ancillary input field to the retrieval algorithm for sea surface salinity (SSS) from L-band satellite radiometers, such as Soil Moisture and Ocean Salinity mission, Aquarius, and Soil Moisture Active Passive mission. It is needed for inverting the radiative transfer model equation of the ocean surface emissivity, which depends both on ocean surface salinity and ocean surface temperature. Our analysis studies the sensitivity of the performance of the Aquarius salinity retrieval algorithm to the ancillary SST that is used in the algorithm. We have retrieved Aquarius salinities using four different SST fields as ancillary input, namely, the National Oceanic and Atmospheric Administration (NOAA) Advanced Very High Resolution Radiometer (AVHRR)-only Optimum Interpolation SST (OISST), the SST from WindSat, the SST from the Canadian Meteorological Center (CMC), and the Multi-scale Ultra-high Resolution (MUR) SST from the National Aeronautics and Space Administration's Jet Propulsion Laboratory. The retrieved Aquarius SSS is compared with ground truth data; thus, the performance of the salinity retrieval algorithm in all four cases can be evaluated. The WindSat, CMC, and MUR SST products, which are all based on or are assimilating SST measurements from the passive microwave (MW) sensors, give better performance than the NOAA AVHRR-only OISST, which does not use any MW SST data, but which is solely based on the *in situ* data and observations from the infrared AVHRR sensor. The CMC SST gives the best overall performance for the retrieved SSS. The sensitivity of the SSS retrievals and therefore the performance differences between the various ancillary input fields increases in cold water.

Index Terms—Enter L-band, microwave radiometry, ocean salinity, ocean temperature, passive microwave remote sensing.

I. INTRODUCTION

THE Aquarius/SAC-D L-band radiometer/scatterometer system has been designed to provide sea surface salinity (SSS) salinity maps at a 150-km spatial scale at an accuracy of 0.2 psu [1] over monthly averages. The instrument provided

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science data starting August 25, 2011 before the observatory suffered a mission-ending hardware failure on June 7, 2015. This leaves a legacy data set of SSS measurements of more than 45 months. The SSS retrieval algorithm has undergone numerous improvements and refinements [2]–[7]. The most recent Version 4.0 [5] has been released on July 17, 2015, and it has been validated that it fulfills the primary mission accuracy requirement of 0.2 psu [8].

The SSS retrieval algorithm takes Aquarius antenna temperatures (T_A) as input and transforms them into brightness temperatures T_{B0} for a flat ocean surface. In this process, a series of spurious signals need to be removed step by step: 1) cosmic, galactic, solar, and lunar radiation; 2) antenna cross polarization; 3) radiation from land surfaces near ocean–land boundaries; 4) Faraday rotation in the Earth ionosphere; 5) atmospheric attenuation by oxygen, water vapor, and liquid cloud water; and 6) effects from the wind-roughened ocean surface. The Aquarius measurements are also filtered for radio-frequency interference (RFI) [9], [10]. The final step in determining SSS is to match this measured T_{B0} at the flat ocean surface with the value that is obtained from the Fresnel equations that characterize the electromagnetic emission from a specular ocean surface based on the Meissner–Wentz model for the permittivity (dielectric constant) of sea-water [11], [12]. Because the model function for T_{B0} depends on sea surface temperature (SST), it is necessary to use an ancillary SST field as input to the SSS retrieval algorithm.

The purpose of this paper is to investigate the sensitivity of the SSS retrievals to the ancillary SST input field. We have run and evaluated the performance of the Aquarius SSS retrieval algorithm with four different SST fields as ancillary input: the National Oceanic and Atmospheric Administration (NOAA) Advanced Very High Resolution Radiometer (AVHRR)-Optimum Interpolation SST (OISST), the weekly SST averages from WindSat, the Canadian Meteorological Center (CMC) daily SST, and the Multi-Scale Ultra-High Resolution (MUR) SST from the Jet Propulsion Laboratory (JPL). All these products are distributed through the Group for High-Resolution SST (GHRSSST). The last three SST products are all based on or assimilate SST measurements from spaceborne microwave sensors, whereas the NOAA AVHRR-only OISST does not ingest any microwave SST, but rather uses infrared-derived SSTs.

Our paper is organized as follows. In Section II, we provide a simple estimate of the sensitivity of the SSS retrieval on SST. Section III gives an overview over the evaluated SST data

sets. The results on the performance comparison of Aquarius SSS retrievals are presented in Section IV. Section V briefly summarizes our main results and conclusions.

II. ESTIMATE OF THE SENSITIVITY OF SSS RETRIEVALS TO SST

The purpose of this section is to provide a simple estimate of the sensitivity of the retrieved SSS to the ancillary SST field. This estimate is based on the physics of the electromagnetic microwave emission of a flat ocean surface at the L-band. Although the results of this section will not be used in the following data analysis, we believe that the findings are useful for demonstrating and understanding the major cause of the sensitivity of the SSS to the ancillary SST.

The crucial step, in which the ancillary SST field T enters the Aquarius SSS retrieval algorithm, is in the calculation of the brightness temperature $T_{B0,mod} = E_0(T, S) \cdot T$ that is emitted by a flat ocean surface. The flat surface emissivity $E_0(T, S)$ is given by the Fresnel equations of specular reflection and is determined by the model of the dielectric constant of sea water [11], [12]. It depends both on the T (SST) and on the S (SSS). The SSS retrieval algorithm matches the model for T_{B0} to the Aquarius measurement in a maximum likelihood estimate. In addition, the specular reflection of the SST ancillary field is also used in the SSS retrieval algorithm to calculate the correction for atmospheric absorption [2] and to derive the correction for the wind-roughened surface [10], but the magnitude of these two corrections is an order of magnitude smaller compared with the size of T_{B0} . We can obtain a simple estimate of the sensitivity of the retrieved Aquarius SSS to the ancillary SST input field from the matching condition

$$T_{B0,meas} = T_{B0,mod}(T, S) = E_{0,mod}(T, S) \cdot T. \quad (1)$$

If we assume that the matching is done only for the vertical polarization (v-pol), we can formally take the partial derivative of (1) with respect to T , i.e.,

$$\begin{aligned} 0 &= \frac{dT_{B0,meas}(v-pol)}{dT} \\ &= \left(\frac{\partial T_{B0,meas}(v-pol)}{\partial T} \right) + \left(\frac{\partial T_{B0,meas}(v-pol)}{\partial S} \right) \cdot \frac{dS}{dT}. \end{aligned} \quad (2)$$

Equation (2) can be solved for the derivative dS/dT , which determines the sensitivity of the retrieved SSS to the ancillary SST, i.e.,

$$\frac{dS}{dT} = - \left(\frac{\frac{\partial T_{B0,meas}(v-pol)}{\partial T}}{\frac{\partial T_{B0,meas}(v-pol)}{\partial S}} \right). \quad (3)$$

In this simplified approach, dS/dT is thus given by the sensitivity ratio between the v-pol emitted T_{B0} from a specular ocean surface to SST and SSS, respectively. The sensitivities on the right-hand side of (3) are effectively determined by the functional dependence of the sea water dielectric constant on T and S [11], [12]. Their values can be numerically calculated from the expressions for the model function for the v-pol T_{B0} by perturbing the values for SST and SSS. The resulting curves

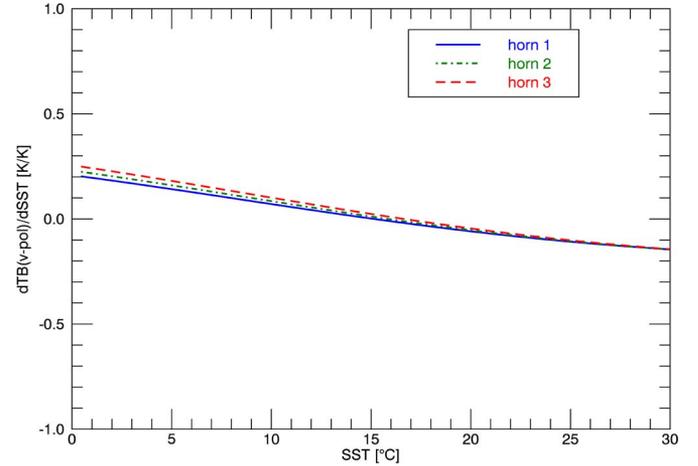


Fig. 1. Sensitivity of the v-pol brightness temperature to SST for the three Aquarius horns: solid line (horn 1), dash-dot line (horn 2), and dashed line (horn 3). In computing the curves, we set the SSS to 35 psu. The nominal values for the EIAs of the three horns are 29.36°, 38.44°, and 46.29°, respectively.

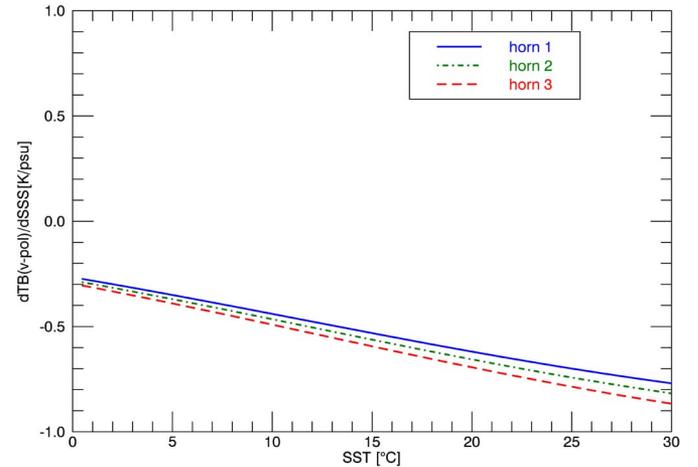


Fig. 2. Sensitivity of the v-pol brightness temperature to the SSS for the three Aquarius horns: solid line (horn 1), dash-dot line (horn 2), and dashed line (horn 3). In computing the curves, we have set the SSS to 35 psu. The nominal values for the EIAs of the three horns are 29.36°, 38.44°, and 46.29°, respectively.

for the three derivatives, namely, $\partial T_{B0}/\partial T$, $\partial T_{B0}/\partial S$, and dS/dT as a function of SST for the three Aquarius horns are shown in Figs. 1–3. As the water becomes colder, the sensitivity of T_{B0} to SST increases (see Fig. 1) and the sensitivity of T_{B0} to SSS decreases (see Fig. 2). As a consequence, the sensitivity of SSS to SST is largest in cold water (below 10 °C) and it decreases with increasing SST. For intermediate temperatures (10 °C–20 °C), the surface-emitted brightness temperature (see Fig. 1) is almost insensitive to SST. According to (3), the retrieved salinity is also insensitive to SST in the intermediate temperature range, which is evident in Fig. 3. In warm water (above 20 °C), the sensitivity of T_{B0} to SST starts increasing again, although the sign changes compared with that of cold water (see Fig. 1). At the same time, the sensitivity of T_{B0} to SSS also keeps increasing with increasing SSS (see Fig. 2). As a consequence, the sensitivity of SSS to SST starts increasing

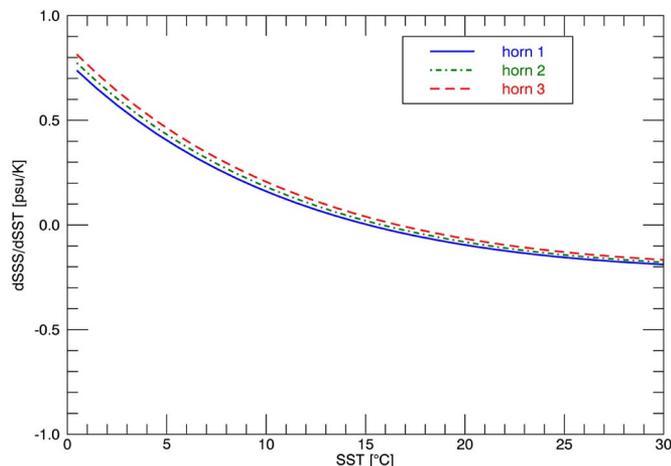


Fig. 3. Estimate of the sensitivity of the retrieved SSS to SST used as given by the derivative dS/dT in (3) as function of SST for the three Aquarius horns: solid line (horn 1), dash-dot line (horn 2), and dashed line (horn 3). In computing the curves we have set SSS to 35 psu. The nominal values for the EIAs of the three horns are 29.36° , 38.44° , and 46.29° , respectively.

slightly above 20°C , although the absolute value is smaller than it is in cold water. The sign of the derivative in Fig. 3 also implies that an increase in the ancillary SST field will increase the retrieved SSS in cold water and decrease the retrieved SSS in warm water. We also note that the sensitivity curves in Fig. 3 are largely independent of the Earth incidence angle (EIA).

The actual Aquarius Version 4.0 SSS retrieval algorithm uses both v-pol and horizontal polarization (h-pol) and performs a maximum-likelihood estimate in determining SSS [4], [7]. The curves in Fig. 3 change very little if the h-pol, rather than the v-pol, is used in the matching (1). We can, therefore, expect that our conclusions about the sensitivity of SSS to SST also hold for the actual Aquarius Version 4.0 SSS retrievals. Most importantly, we anticipate that the differences in the ancillary SST input field will impact the SSS retrievals strongest in cold water and therefore be most visible at high latitudes.

III. STUDY DATA SETS

A. Aquarius Data

Our analysis is based on the Version 4.0 Aquarius Official Release Level 2 SSS from NASA PO.DAAC [13]. Using the provided quality control (Q/C) flags, the data have been screened for contamination from land and sea ice if the gain weighted average of either land or sea-ice fraction within the field of view exceeds 0.1%. In addition, the observations with high galactic and high lunar radiation, and those which are likely contaminated by undetected RFI, have been also excluded. The time period of our analysis spans the entire Aquarius mission, August 25, 2011–June 7, 2015.

B. SST Data Sets

The rationale for deriving the SSS using these four different SST data sets is to demonstrate the effect on the SSS retrievals attributable to the choice of SST data used. Each of these data sets described next is exemplary in the type of input SST data

used, namely, *in situ*, infrared, and/or microwave SSTs. We will address the question of which one of these data sets leads to the highest quality SSS retrieval in this paper.

1) *NOAA AVHRR-OISST*: The NOAA AVHRR Optimally Interpolated (AVHRR-OISST) [14]–[16] was the original data set implemented in the Aquarius retrievals because of the bias-free SST estimates with respect to *in situ* data. This data set does not include any microwave-derived SSTs. It has been used as the ancillary field SST in the algorithms used for all Aquarius data releases up to the current Version 4.0. The AVHRR-OISST product is distributed through the GHRSSST project and can be downloaded through the Physical Oceanography Distributed Active Archive Center (PO.DAAC) at: https://podaac.jpl.nasa.gov/dataset/NCDC-L4LRblend-GLOB-AVHRR_OI. It combines both AVHRR infrared-derived SSTs and *in situ* SSTs using optimum interpolation (OI). The Pathfinder Version 5 product is used when available, whereas the NOAA AVHRR operational product is used as a second choice. The product is available as daily 0.25° grids. Details on the optimal interpolation technique used and the AVHRR-OI data set may be found in [15].

2) *WindSat SST*: WindSat provides a microwave-only SST that allows for the direct comparison between an infrared-only (AVHRR-OISST) data set and a microwave-derived SST. The major advantage of the microwave sensor is the capability to retrieve SSTs under cloudy conditions. Additionally, it provides better SSS retrievals in areas of high water-vapor content and aerosols. Our analysis uses the Remote Sensing Systems (RSS) Version 7.0.1. WindSat daily 0.25° SST fields [17]. The RSS WindSat SST retrieval algorithm uses all WindSat channels at 6.8, 10.7, 18.7, 23.8, and 37.0 GHz. The WindSat SST data have been filtered for contamination from land, sea ice, and rain. In order to obtain global coverage when using the WindSat SST as ancillary input to the Aquarius SSS retrieval algorithm, we created running 7-day averages from the daily WindSat SST files that are centered on each day. Because the local ascending node times of Aquarius and WindSat are both approximately 18:00, it is possible to find matchups between Aquarius and WindSat observations within a typical time collocation window of 60 min. However, the swath of the WindSat SST field is very narrow and, therefore, many Aquarius SSS observations get lost if we use actual WindSat swath SST matchups in the Aquarius SSS processing algorithm.

3) *CMC SST*: The CMC product provides a data set that includes both infrared and microwave-derived SSTs. *In situ* data are also incorporated from the International Comprehensive Ocean-Atmosphere Data Set (ICOADS) data set. Thus, this SST data set should have the advantage of incorporating all three types of SST data, namely, infrared, microwave, and *in situ*. This product is distributed through the GHRSSST project and can be downloaded from the PO.DAAC web site (<https://podaac.jpl.nasa.gov/dataset/CMC0.2deg-CMC-L4-GLOB-v2.0>). The Level 4 SST analysis is produced daily, on an operational basis, at the CMC. This data set merges infrared SSTs available at varying points in the time series from the Along-Track Scanning Radiometer (ATSR) series of radiometers onboard ERS-1, ERS-2, and Envisat, and from the AVHRR onboard NOAA-16, 17, 18, 19 and METOP-A. The microwave SSTs are from the

Tropical Rainfall Measuring Mission microwave imager (TMI), the Advanced Microwave Scanning Radiometer onboard the Earth Observing Satellite (AMSR-E) and WindSat onboard the Coriolis satellite. *In situ* observations of SST from drifting buoys and ships from the ICOADS program are included. The CMC SST data are placed on a 0.2° grid for daily maps. Unlike the AVHRR-OI, the CMC SST data set combines both infrared (ATSR, AVHRR) and microwave (TMI, AMSR-E, WindSat) using optimal interpolation [18].

4) *MUR SST*: The MUR SST data set differs from the previous two data sets in some key ways. Like the CMC, it uses both infrared- and microwave-derived SSTs (AMSR-E and WindSat). *In situ* data are used as reference for the removal of biases. This MUR SST product has greater numbers of cloud-free infrared-derived SSTs because of the addition of SSTs from the Moderate Resolution Imaging Spectroradiometer onboard both the Aqua and Terra platforms. MUR SSTs are distributed as part of the GHRSSST project and are available through the PO.DAAC at: <https://podaac.jpl.nasa.gov/dataset/JPL-L4UHfnd-GLOB-MUR>. More information on the algorithm and its implementation may be found in [19]. Briefly, the data set is produced using a series of wavelets as a basis function in an optimal interpolation. Daily maps are produced on a global 0.011° global grid in near real time with a one day lag.

C. Matchup With Aquarius Observations

The NOAA AVHRR-OI, CMC SST, and MUR SST fields are daily averages. The WindSat SST fields are weekly running averages. In all cases, the SST product data fields are linearly interpolated in space and time to the Aquarius swath observations. The temporal resolution of the SST fields that are used in our analysis does not allow for assessing if the diurnal variations in the SST ancillary field might impact the SSS retrievals. We expect this impact is small and that it does not change the main conclusions of our study. As shown in [20], the diurnal warming of the ocean surface layer is sizeable during midafternoon and at low wind speeds. The Aquarius local ascending/descending node times are at 18:00 and 6:00, respectively, and thus, the diurnal warming is small. In addition, low wind speeds predominantly occur in warmer water and, as discussed in Section II, the major impact of the ancillary SST fields is expected to occur at high latitudes, where the average wind speeds are large, and therefore, rapid mixing of the ocean surface layer occurs and wipes out any diurnal SST warming.

IV. PERFORMANCE EVALUATION

A. Level 2 Swath Observations

Aquarius L2 SSS are retrieved in 1.44-s intervals. In order to evaluate the performance of the SSS retrievals for the different SST ancillary input fields, we use the standard deviation σ between the SSS from Aquarius and the daily HYbrid Coordinate Ocean Model (HYCOM) upper ocean layer SSS field [21]–[24] as a metric. The HYCOM SSS is first resampled to $0.25^\circ \times 0.25^\circ$ spatial resolution and then is linearly interpolated in space and

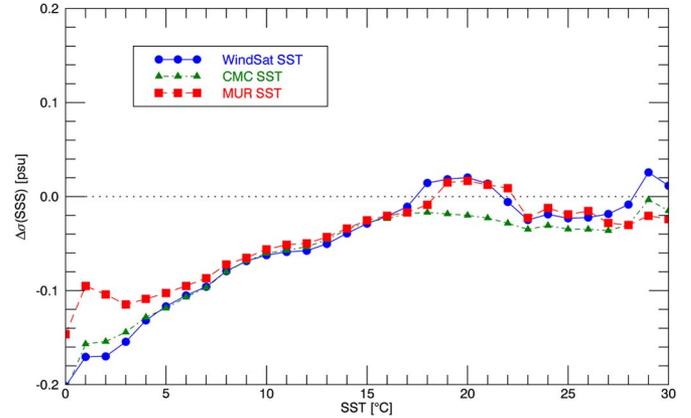


Fig. 4. Change in performance of the Aquarius L2 SSS retrievals as a function of SST used in the algorithm based on the standard deviation between Aquarius and HYCOM SSS as defined in (4). The bin size is 1 K. The circles/solid line are the results from using WindSat SST (see Section III-B2) as the ancillary SST field in the SSS retrieval, the triangles/dash-dot line are the results from using CMC SST (see Section III-B3), and the squares/dashed line are the results from using MUR SST (see Section III-B4). A positive/negative value for the performance change indicates performance degradation/improvement relative to the NOAA AVHRR-OISST product currently used for the Aquarius Version 4.0 SSS product.

time to the Aquarius Level 2 swath observations. As we are interested in the performance relative to the NOAA AVHRR-OI-derived baseline SSS product, which is used in Version 4.0, we plot the root-mean-square (rms) differences, i.e.,

$$\Delta\sigma_i = \pm \sqrt{|\sigma_i^2(\text{Aq-HYCOM}) - \sigma_0^2(\text{Aq-HYCOM})|}. \quad (4)$$

The index $i = 1, 2, 3$ in (4) indicates the retrievals with the WindSat, CMC, and MUR ancillary SST fields, respectively. The baseline case using the NOAA AVHRR-OI is labeled as $i = 0$. The \pm sign in (4) applies if the standard deviation σ_i has increased/decreased from $i = 0$, and thus, the algorithm performance has decreased/increased compared with the baseline case.

Fig. 4 shows the results for $\Delta\sigma_i$ as a function of SST, where we have averaged over all three Aquarius horns. As expected from the sensitivity discussion in Section II, the SSS differences between the different ancillary SST input fields increase with a decreasing SST. It is evident that all three SST fields that use microwave satellite SST information perform better than the NOAA AVHRR-only OI baseline case. Among the three SST fields, the best overall performance is achieved when using the CMC SST. We have also checked that there are no significant biases as function of SST when retrieving Aquarius SSS using the four different SST ancillary fields $i = 0, \dots, 3$ by comparing each of the SSS retrievals to HYCOM.

B. Monthly Averages

The Aquarius mission accuracy requirement is set for the global rms uncertainty of monthly averaged Aquarius SSS retrievals. Therefore, it is warranted to evaluate the performance between the various ancillary SST fields for the global monthly SSS averages. The rms uncertainty in the Aquarius

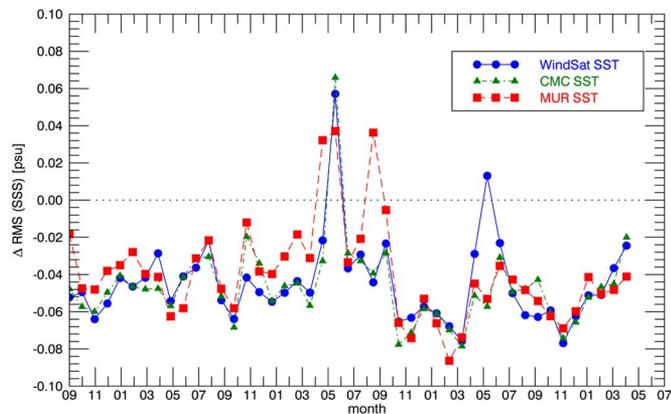


Fig. 5. Change in performance of Aquarius monthly $3^\circ \times 3^\circ$ SSS averages based on the Aquarius rms error that is estimated from triple collocations between Aquarius, ARGO, and HYCOM SSS maps as defined in (6). The time period is September 2011–May 2015. The circles/solid line are the results from using WindSat SST (see Section III-B2) as the ancillary SST field in the SSS retrieval, the diamonds/dash-dot line are the results using CMC SST (see Section III-B3), and the squares/dashed line are the results using MUR SST (see Section III-B4). A positive/negative value for the performance change indicates performance degradation/improvement relative to the NOAA AVHRR-OISST field.

SSS retrievals can be estimated from the triple collocations [8] between Aquarius, ARGO [25], and HYCOM SSS values. Although the HYCOM-analyzed SSS field does assimilate information from the ARGO *in situ* measurements, it can be assumed that the errors in the ARGO and HYCOM SSS are approximately independent. On global and monthly timescales, there are no significant biases between Aquarius, ARGO, and HYCOM SSS [8]. Therefore, the individual rms uncertainties of the Aquarius, ARGO, and HYCOM SSS can be computed from the statistics for triple matchups. Specifically, the estimated rms Aquarius uncertainty is

$$\text{rms}_i^2(\text{Aq}) = \frac{1}{2} [\text{rms}_i^2(\text{Aq-ARGO}) + \text{rms}_i^2(\text{Aq-HYCOM}) - \text{rms}_i^2(\text{Aq-HYCOM})]. \quad (5)$$

The index $i = 0, \dots, 3$ runs over the different SST ancillary input fields as specified in Section IV-A. The rms of the mutual differences on the right-hand side of (5) is computed over ensembles of global monthly binned maps. As we did in the case of the individual swath observation (see Section IV-A), we consider again the performance of the three SST cases $i = 1, 2, 3$ (WindSat, CMC, MUR) relative to the baseline case $i = 0$ (NOAA AVHRR-OI) and therefore compute the following rms differences:

$$\Delta \text{rms}_i = \pm \sqrt{|\text{rms}_i^2(\text{Aq}) - \text{rms}_0^2(\text{Aq})|} \quad i = 1, 2, 3. \quad (6)$$

The results for Δrms are shown in Fig. 5 as monthly time series and reveal a similar conclusion as in the case of the Level 2 swath data.

The performance estimate of the Aquarius salinity retrieval in the validation study [8] excluded observations if the SST is lower than 5°C or if the surface wind speed exceeds 15 m/s. The reason for this is that at a very low SST, the sensitivity

TABLE I
TOTAL RMS UNCERTAINTIES OF AQUARIUS MONTHLY $3^\circ \times 3^\circ$ SSS AVERAGES (IN PRACTICAL SALINITY UNITS) THAT WERE ESTIMATED FROM TRIPLE COLLOCATIONS BETWEEN AQUARIUS, ARGO AND HYCOM SSS MAPS FOR THE FOUR ANCILLARY SST FIELDS USED IN THE AQUARIUS ALGORITHM

NOAA AVHRR-OI	0.172
WindSat	0.165
CMC	0.164
MUR	0.166

of the brightness temperature to the SSS gets very small (see Fig. 2) and, as a consequence, any small random or systematic uncertainties that enter the retrieval algorithm get magnified. At high wind speeds, the wind-induced emissivity signal becomes large, and thus, uncertainties in the ancillary wind speed used in the surface roughness correction [6] also grow. We have followed the same approach when calculating the performance estimate in Fig. 5 and did not include observations if the SST is lower than 5°C or the surface wind speed exceeds 15 m/s.

During almost all months, the three SST ancillary fields tested that use microwave measurements in their production result in better performance than the NOAA AVHRR-OISST product. The differences between the three cases $i = 1, 2, 3$ are small for most months. Table I summarizes the values for the total estimated rms uncertainties in the retrieved Aquarius SSS.

V. SUMMARY AND CONCLUSION

We ran the Aquarius SSS retrieval algorithm with three different ancillary SST fields and compared the SSS values with those from the baseline SSS obtained using the NOAA AVHRR-OISST product currently used in Version 4.0 of the official data release. All of the three SST ancillary fields that were evaluated (WindSat, CMC, MUR) are based on or assimilate microwave satellite SST data. We find that all three of the SST products tested perform better in the SSS retrievals than the baseline NOAA AVHRR-OI, which only uses infrared and *in situ* SSTs but no microwave SST. SST that is retrieved from the infrared sensors is known to degrade under clouds, high water vapor (tropics), and aerosols (Saharan dust storms), whereas the microwave SST is little or not affected in these conditions. Although the infrared sensors can measure SST at much higher spatial resolutions than microwave sensors, this hardly constitutes an advantage for SSS retrievals with L-band radiometers, which have large footprint sizes of typically 40–150 km.

We obtain the best overall performance in the Level 2 product when using the CMC SSTs as the ancillary input to the Aquarius SSS retrieval algorithm. Future plans are to change the ancillary SST field used as the input to the algorithm from the NOAA AVHRR-OI to the CMC SST in the upcoming Aquarius SSS releases.

Although our analysis was completed using Aquarius SSS, we expect that the same conclusions will hold for the SSS measurements from the other L-band sensors, such as SMOS [26] or SMAP [27], [28].

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