

Article

Evaluation of the J-OFURO3 Sea Surface Net Radiation and Inconsistency Correction

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Abstract: A new satellite-based product containing daily sea surface net radiation (R_n) values at a spatial resolution of 0.25° from 1988 to 2013, named the Japanese Ocean Flux Data Sets with Use of Remote Sensing Observations, version 3 (J-OFURO3), was recently generated and released. In this letter, the performance of the J-OFURO3 sea-surface R_n product was fully evaluated by using observations from 55 global moored buoy sites. The overall accuracy was satisfactory, with root-mean-square difference (RMSD) of 24.05 and 10.76 Wm^{-2} at daily and monthly scales, respectively. However, an inconsistency issue was found in the long-term variations in the J-OFURO3 sea-surface R_n values in approximately 2000; this inconsistency may be due to the replacement of the input dataset. To address this issue, a simple but effective inconsistency correction method was developed and conducted in this study. The analysis results demonstrated that the variations in the corrected J-OFURO3 sea-surface R_n data were more reasonable and that its daily validation accuracy was significantly improved by decreasing the bias from 4.67 to 0.27 Wm^{-2} before the year 2000. Thereby, it is suggested that the inconsistency correction method should be applied before using the J-OFURO3 sea-surface R_n data. However, the data users still should be cautious about another discontinuity issues caused by the quality of the input dataset itself.

Keywords: net radiation; sea surface; J-OFURO3; evaluation; moored buoy site; remote sensing; inconsistency correction; spatiotemporal variation



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1. Introduction

Sea areas cover more than 70% of Earth's surface, and they store large amounts of energy, significantly affecting the general atmospheric and oceanic circulations [1]; therefore, global and regional climates are changed through frequent air–sea flux exchanges. Hence, accurate estimations of the oceanic heat fluxes (e.g., net radiation flux and turbulent heat flux) are of great significance for evaluating the energy balance of the Earth system. The sea surface net all-wave radiation (R_n) is the difference between the total downward and upward shortwave and longwave radiation on the sea surface and describes the radiative energy balance at the air–sea interface. As an essential parameter, the sea-surface R_n can directly affect the heat content of the ocean and the sea-surface temperature (SST) [2]; moreover, the sea-surface R_n is also one of the most important inputs to most ocean surface physical models [3]. However, the sea-surface R_n has received less attention than the turbulent flux components (i.e., latent heat flux (LHF) and sensible heat flux (SHF)), and it has been either ignored or removed from simple climatology models or parameterizations in most previous studies [4].

A new satellite-based product containing radiative fluxes on the sea surface, named the Japanese Ocean Flux Datasets with Use of Remote Sensing Observations, version 3

(J-OFURO3, hereinafter), and including data from 1988 to 2013 at a 0.25° spatial resolution, was developed and recently released by Nagoya University, Japan (<https://j-ofuro.scc.u-tokai.ac.jp/en/>, accessed on 1 December 2019) [5]. The J-OFURO project focused on developing datasets of surface heat, momentum, and freshwater fluxes over global ice-free sea areas. J-OFURO3 is the latest version of this project and contains significant improvements over J-OFURO [6] and J-OFURO2 [7], including accuracy improvements and a new validation scheme [5]. Various parameters in J-OFURO3 have been validated with satisfactory results, such as the sea-surface LHF and SHF [5]; hence, J-OFURO3 is popular and is widely used in various applications [8,9]. J-OFURO3 provides daily net shortwave radiation (R_{ns}) and net longwave radiation (R_{nl}) data, and these values can be directly combined to obtain daily sea-surface R_n values. The sea-surface R_{ns} and R_{nl} values in J-OFURO3 are calculated by subtracting the upward shortwave radiation (R_{su}) and longwave radiation (R_{lu}) from the downward shortwave radiation (R_{si}) and longwave radiation (R_{li}), respectively. Specifically, R_{si} , R_{li} , and R_{su} are all obtained from the International Satellite Cloud Climatology Project radiative flux D-series product (ISCCP-FD) [10] comprising the period from January 1988 to February 2000 and from the Clouds and the Earth's Energy System Synoptic Radiative Fluxes and Clouds edition 3A (CERES-3A) product at a 1° spatial resolution [11], covering the period from March 2000 to December 2013. These products were re-gridded to a spatial resolution of 0.25° over open waters, and their near-coastal areas were further processed with the creeping sea fill (CSF) extrapolation method [12], while the R_{lu} values were calculated according to the Plank function, in which the SST values were obtained from J-OFURO3 as the ensemble median values based on multiple global sea-surface temperature products [5] and the sea-surface emissivity was defined as 0.984 [13]. Notably, J-OFURO3 only covers ice-free global oceans, and the sea-ice mask used was obtained from the operational sea-surface temperature and sea-ice analysis (OSTIA, [5]). To date, the performance of the J-OFURO3 sea-surface R_n data is still unknown.

In this paper, observations from 55 moored buoy sites were collected to evaluate the performance of the J-OFURO3 sea-surface R_n data from the 1988–2013 period at both daily and monthly scales over global ice-free oceans. Then the consistency of the long-term J-OFURO3 sea-surface R_n data was examined and analyzed. To address the inconsistency issue, a simple correction scheme was proposed and conducted thereafter, and finally, the performance of the corrected J-OFURO3 sea-surface R_n data was fully evaluated and discussed, including the spatiotemporal analysis. The objective of this paper is to inform the data users of the comprehensive performance of the J-OFURO3 sea-surface R_n data and present an effective inconsistency correction scheme for this product.

2. Data and Methods

2.1. Data Processing

Sea-surface R_n is not a routine measurement on the sea surface; instead, R_{si} , R_{li} , and SST (unit: K) are often measured. Hence, the sea-surface R_n at each moored buoy site can be calculated as follows:

$$R_{ns} = R_{si}(1 - \alpha_{ocean}) \quad (1)$$

$$R_{nl} = R_{li} - [\epsilon_{ocean}\sigma S_{ST}^4 + (1 - \epsilon_{ocean})R_{li}] \quad (2)$$

$$R_n = R_{ns} + R_{nl} \quad (3)$$

where α_{ocean} is the daily sea-surface shortwave broadband albedo, ϵ_{ocean} is the daily sea-surface broadband emissivity, and σ is the Stefan–Boltzmann constant ($5.67 \times 10^{-8} \text{ W}\cdot\text{m}^{-2}\cdot\text{K}^{-4}$). The terms α_{ocean} and ϵ_{ocean} were usually defined as constants in many previous studies without consideration of their variations [13,14]; therefore, the use of the α_{ocean} dataset (2000–2013) from Feng [15] and the ϵ_{ocean} dataset (1988–2013) from Cheng [16], both of which have 0.05° spatial resolutions at the daily scale used in this study, would be more reasonable than the use of data from other studies [17,18]. Note that the α_{ocean} dataset starts in 2000; thus,

the multiannual average daily α_{ocean} values from 2000 to 2013 were used for the period before 2000 (1988 to 1999) by considering the relatively lower variations in the values of this parameter from year to year. The units for all radiative components are Wm^{-2} , the time format is GMT, and the downward direction is positive in this study.

The R_{si} , R_{li} , and SST measurements were collected from 55 global moored buoy sites in 5 measuring networks (Table 1) and have been commonly used in previous studies [19,20]. Figure 1 shows the distribution of these buoy sites, which were mainly located within the sea areas between 50° S and 50° N. After strict quality control and a manual inspection, only the measurements with the highest quality were kept [21]. For measurements with sampling frequencies less than one day (i.e., the Ocean Sustained Inter-Disciplinary Time-Series Environment Observation System (OS) and Upper Ocean Processes Group (UOP) data), the daily mean R_{si} , R_{li} , and SST values were calculated by averaging all hourly observations as long as no missing data appeared in one day. Afterwards, the daily R_n value was obtained according to Equations (1)–(3), and then the monthly R_n value was calculated only when more than 60% of the daily R_n samples in the corresponding month were available. Finally, totals of 56,460 daily and 1773 monthly in situ sea-surface R_n samples were obtained and used for the accuracy validation.

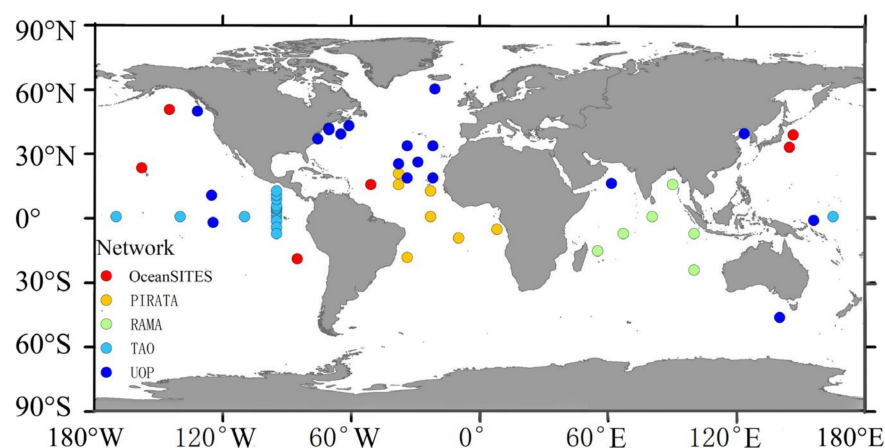


Figure 1. Distribution of 55 moored buoy sites in five measuring networks.

According to the locations of the 55 moored buoy sites, the J-OFURO3 daily sea-surface R_n data, which were calculated by combining the J-OFURO3 daily R_{ns} and R_{nl} values directly, were extracted from 1988 to 2013 and processed into a monthly scale. The sea-surface R_n data in J-OFURO3 were obtained with a spatial resolution of 0.25° from 1988 to 2013 at daily and monthly scales and then extracted according to the locations of the 55 buoy sites. Moreover, sea-surface R_n data were derived from four popular reanalysis products and a ship-based product, the Japanese 55-Year Reanalysis (JRA55, $0.56^\circ \times 0.56^\circ$) from the Japanese Meteorology Administration (JMA) [22], ERA5 ($0.25^\circ \times 0.25^\circ$) from the European Centre for Medium-Range Weather Forecasts (ECWMF) [23], the Modern Era Retrospective Analysis for Research and Applications, version 2 (MERRA2, $0.625^\circ \times 0.5^\circ$) [24] from NASA's Global Modeling Assimilation Office (GMAO), the third-generation, high-resolution version of the ISCCP radiative flux profile product named ISCCP-FH ($1^\circ \times 1^\circ$, 1983–2017) [25], and the ship-based product NOCS v2.0 ($1^\circ \times 1^\circ$, 1973–2014) by in situ observations from voluntary observing ships contained in the International Comprehensive Ocean–Atmosphere Data Set (ICOADS) [26], extracted at daily and monthly scales from 1988 to 2013, and used for comparison in this study.

Table 1. Information on the five measuring projects/networks.

Network	Site No	Observation Frequency	Time Span	URL
OS	6	1 h	2000–2018	dods.ndbc.noaa.gov/oceansites/ accessed on 27 May 2021
TAO	15	Daily	2000–2016	www.pmel.noaa.gov/gtmba/pmel-theme/pacific-ocean-tao accessed on 27 May 2021
RAMA	6	Daily	2004–2016	www.pmel.noaa.gov/gtmba/pmel-theme/indian-ocean-rama accessed on 27 May 2021
PIRATA	7	Daily	2006–2016	www.pmel.noaa.gov/gtmba/pmel-theme/atlantic-ocean-pirata accessed on 27 May 2021
UOP	21	1 h	1988–2016	uop.whoi.edu/index.html accessed on 27 May 2021

OS, Ocean Sustained Inter-Disciplinary Time-Series Environment Observation System [27], accessed on 1 December 2019; TAO, the Tropical Atmosphere Ocean/Triangle [28], accessed on 1 December 2019; RAMA, Research Moored Array for African–Asian–Australian Monsoon Analysis and Prediction [29], accessed on 1 December 2019; PIRATA, Pilot Research Moored Array in the Tropical Atlantic [30], accessed on 1 December 2019; UOP, Upper Ocean Processes Group [31], accessed on 1 December 2019.

2.2. Methodology

First, the accuracy of the J-OFURO3 sea-surface R_n was validated against the moored samples at both daily and monthly scales. Three commonly used statistical indices (coefficient of determination (R^2), root-mean-square difference (RMSD), and bias) were applied to measure the uncertainties. Note that the in situ sea-surface R_n used in this study was not the direct measurement, so it is more reasonable to use RMSD to represent the difference between J-OFURO3 and in situ sea-surface R_n . Then the consistency performance of the J-OFURO3 sea-surface R_n dataset was assessed by examining the variations in its averaged annual mean values over global ice-free seas. After that, a correction method was proposed for addressing the inconsistency issues in the J-OFURO3 sea-surface R_n , as Figure 2 shows.

Three major steps were contained in this method. In Step 1, the thresholds were defined to determine the pixels with inconsistency issues. By considering the relatively stable performances and available time lengths, three products (ERA5, JRA5, and ISCCP-FH) were taken as the references. The differences between the average annual mean sea-surface R_{ns} (ΔR_{ns}) and R_{li} (ΔR_{li}) values before and after 2000 (the averages for 2000–2013, minus the averages for 1993–1999) for the three products were computed and then interpolated into a 0.25° grid, respectively; then the thresholds for each 0.25° pixel were defined as the sum of the median and the standard deviation of the ΔR_{ns} and ΔR_{li} values of the three products. In Step 2, all the J-OFURO3 pixels that needed to be corrected were determined as long as their ΔR_{ns} or ΔR_{li} values exceeded the corresponding thresholds. Then, in Step 3, because of the superiority of the performance in the CERES-3A radiation product both for land and sea surfaces, as indicated by previous studies [32,33], a set of regression models were built pixel by pixel by regressing the sea-surface R_{ns} or R_{li} value from the ISCCP-FD dataset to that from the CERES-3A dataset during their overlapping period from 2001 to 2009 to correct these inconsistent pixels, and then these models were applied on the R_{ns} and/or R_{li} value of these selected pixels from 1988 to 1999 by assuming that the relationships of the sea-surface R_{ns} or R_{li} values between ISCCP-FD and CERES-3A remained constant. The correction model is shown in Equation (4):

$$Y = aX + b \quad (4)$$

where X is the daily sea-surface R_{ns} or R_{li} value from the ISCCP-FD dataset from 2001 to 2009, Y is the daily sea-surface R_{ns} or R_{li} value from the corresponding CERES-3A dataset from 2001 to 2009, and a and b are the regression coefficients.

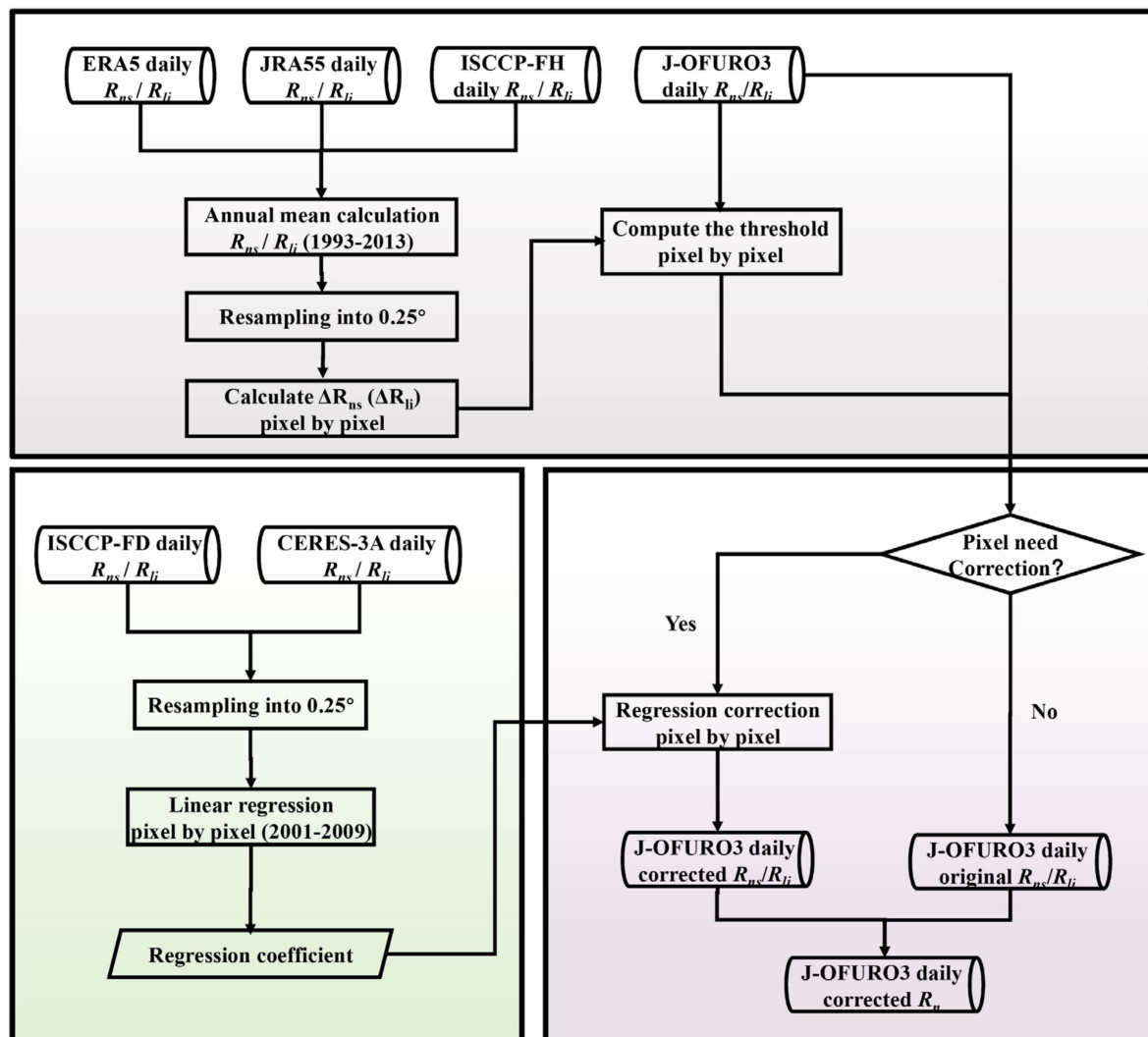


Figure 2. Flowchart of the inconsistency correction undertaken for the J-OFURO3 sea-surface R_{ns} and R_{li} values.

Finally, the annual trends observed in the sea-surface R_n data from 1988 to 2013 were calculated by using the corrected J-OFURO3 sea-surface R_n values with a linear regression model [34], and the results were compared to those calculated from ERA5.

3. Results and Discussions

3.1. Evaluation against the In Situ Observations

Figure 3 presents the explicit spatial distribution of the J-OFURO3 multiannual mean sea-surface R_n data from 1988 to 2013. The sea-surface R_n values decrease from the equatorial to the high-latitude sea areas, and nearly no data are available when the latitude is higher than 60° .

The scatter plots of the J-OFURO3 daily/monthly sea-surface R_n data from 1988 to 2013 against the in situ sea-surface R_n data are shown in Figure 4. The two plots show that the daily and monthly J-OFURO3 and in situ sea-surface R_n values are symmetrically distributed around the 1:1 line, with overall R^2 values of 0.86 and 0.96, RMSD values of 24.05 and 10.76 Wm^{-2} , and biases of 0.16 and 0.22 Wm^{-2} for the daily and monthly scales, respectively, which were similar to the results obtained by Jiang et al. [35] with RMSD of 24.712 Wm^{-2} .

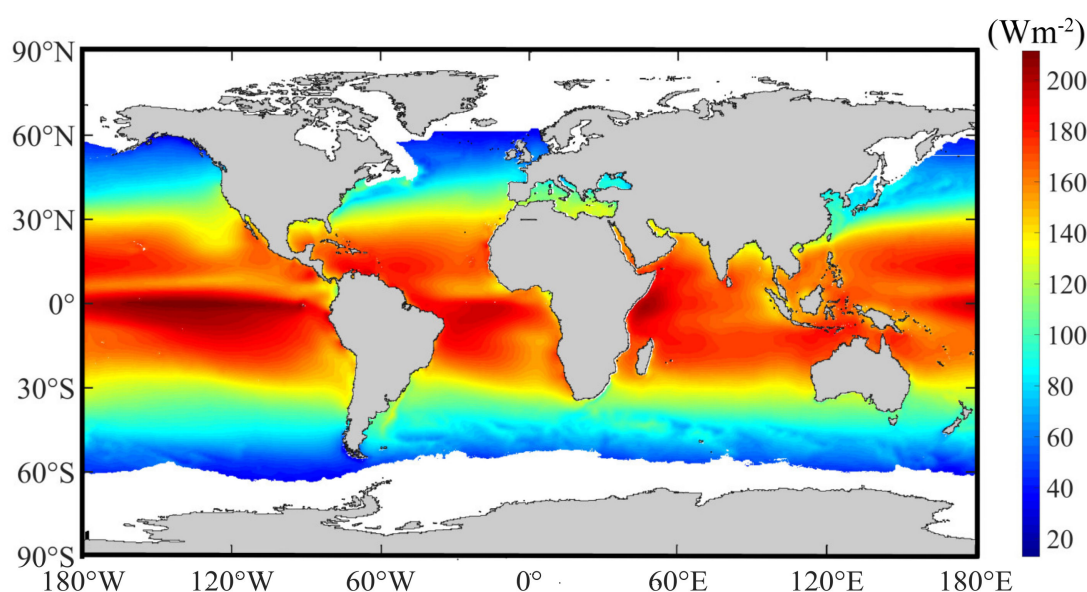


Figure 3. Multiannual mean J-OFURO3 sea-surface R_n values during the period from 1988 to 2013.

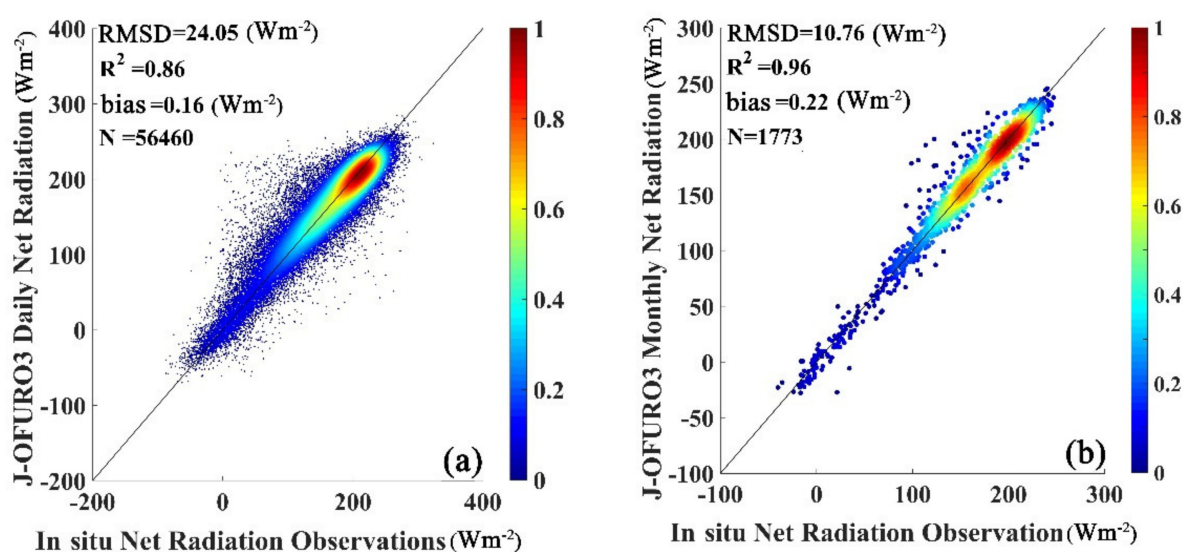


Figure 4. Scatter plots between the J-OFURO3 sea-surface R_n data and the in situ measurements at (a) daily and (b) monthly scales.

Figure 5 presents the spatial distribution of the J-OFURO3 sea-surface R_n uncertainties at each individual site presented with the RMSD values. The increased RMSD values from the sites in open-sea areas to those in coastal areas at both the daily and monthly scales indicate that the performance of the J-OFURO3 sea-surface R_n gradually worsened; it was speculated that the worse accuracy of this dataset in coastal areas than in open-sea areas was possibly caused by pixels being extrapolated from nearby pixels, even though no satellite observations were available [12]; further quality checks should be performed in coastal areas, as pointed out by Tomita [5].

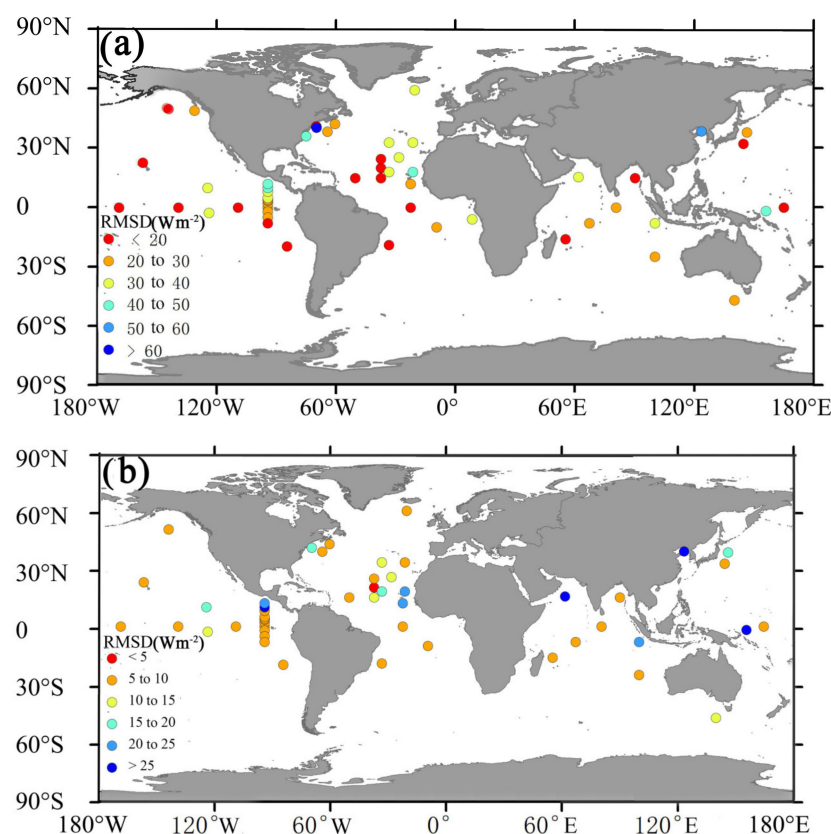


Figure 5. Spatial distribution of the RMSD of the J-OFURO3 sea-surface R_n data at individual site at (a) daily and (b) monthly scales.

3.2. Inconsistency Analysis

3.2.1. Inconsistency Examination

The annual mean J-OFURO3 sea-surface R_n values from 1988 to 2013 were calculated and compared with the values contained in three reanalysis products (JRA55, ERA5 and MERRA2) over the global ice-free oceans, as defined by J-OFURO3 and shown in Figure 6.

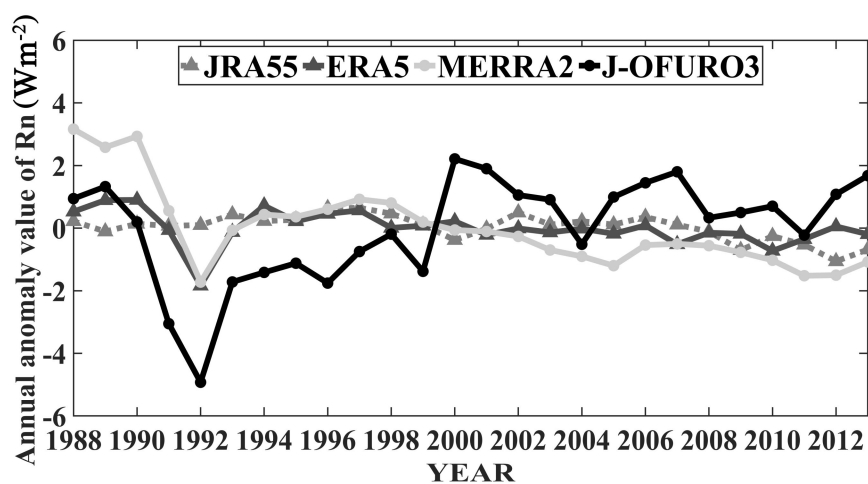


Figure 6. Interannual variations in the annual mean anomalies in the sea-surface R_n values recorded from 1988 to 2013 in JRA55, ERA5, MERRA2, and J-OFURO3.

Generally, the variations in the annual mean sea-surface R_n data contained in the three reanalysis products were similar to each other, with gentle but slightly decreasing

trends over the past 26 years, compared to the more dissimilar trend observed in the J-OFURO3 dataset (the black line in Figure 6), especially after 2000. Moreover, two abrupt turning points were observed in the J-OFURO3, with a sudden decrease in approximately 1992 and a sharp increase during 1999/2000. The sudden drop in 1992 also appeared in the ERA5 and MERRA2 products; this drop was thought to be caused by the satellite observations taken as the inputs of the three products being influenced by the eruption of Mount Pinatubo in 1991 [36,37]. However, the other sharp increase from 1999 to 2000 with a value larger than 3 Wm^{-2} only appeared in the J-OFURO3 dataset. To explore the reasonability of this sudden increase, the differences in the annual mean sea-surface R_n values before 1999 and after 2000 (calculated by the means of 2000/2001 minus the means of 1998/1999) in the J-OFURO3 dataset were calculated and compared with those from the other three reference datasets of three different types, including the satellite-based product ISCCP-FD, the reanalysis product ERA5, and the ship-based product NOCS 2.0. Results shown in Figure 7 indicate that only the annual mean sea-surface R_n values of the J-OFURO3 dataset changed significantly both in magnitude and spatial distribution between the periods before 1999 and after 2000, with the values decreasing even more than 20 Wm^{-2} , mainly in the equatorial seas, and with increasing values over nearly all other oceans (Figure 7a); the results obtained from the other three reference datasets were more similar to each other than to the J-OFURO3 dataset (Figure 7b–d). Therefore, it was assumed that the abrupt increase observed during 1999/2000 in the J-OFURO3 sea-surface R_n time series was unreasonable.

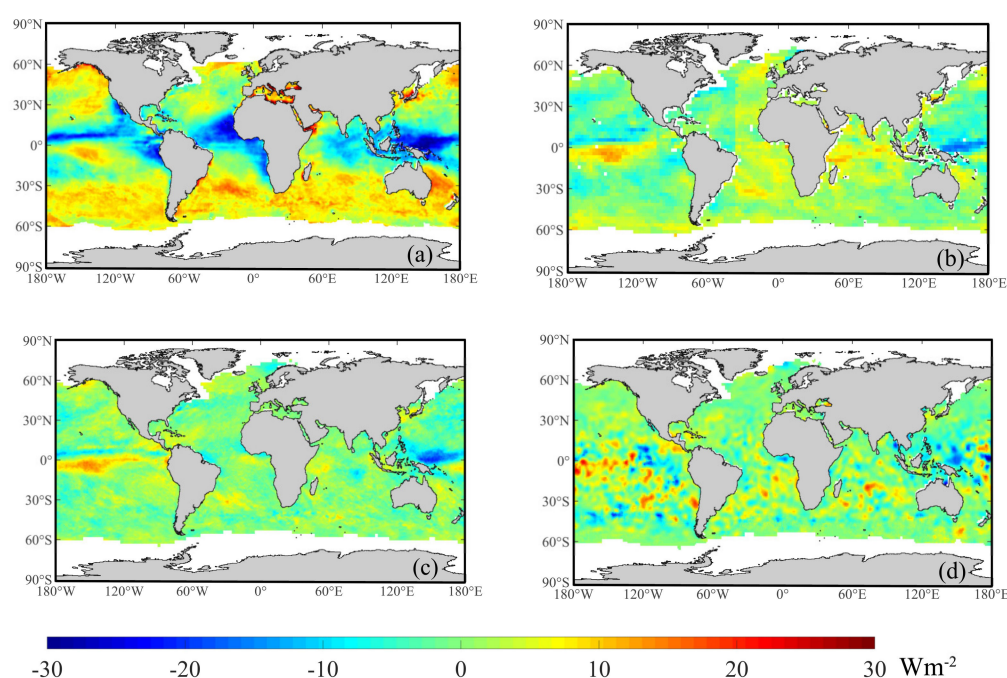


Figure 7. The differences between the average annual mean sea-surface R_n values in 1998/1999 and in 2000/2001 for the (a) J-OFURO3, (b) ISCCP-FD, (c) ERA5, and (d) NOCS 2.0 datasets.

To determine the reason for this discrepancy, the consistency of each radiative component in the J-OFURO3 dataset was further examined. As mentioned above, the major radiative components (R_{ns} and R_{li}) in the J-OFURO3 dataset were interpolated from the ISCCP-FD (before 2000) and CERES-3A datasets; hence, the average annual mean sea-surface R_{ns} and R_{li} values over the global ice-free oceans obtained from the two data sources (ISCCP-FD from 1988–2009 and CERES-3A from 2001–2013) were examined, and then, the SST values from J-OFURO3 during 1988–2013 were also examined, as they determined the R_{lu} values. All results are shown in Figure 7. Obvious discrepancies were seen between ISCCP-FD and CERES-3A during their overlapping period (2000–2009) in

both the sea-surface R_{ns} (Figure 8a) and R_{li} (Figure 8b) values, especially for R_{li} , while the relatively stable variations observed in the SST data (Figure 8c) indicated that the sharp increase in the J-OFURO3 sea-surface R_n values during 1999/2000 was most likely caused by the changes in the input data sources of R_{ns} and R_{li} in approximately 2000.

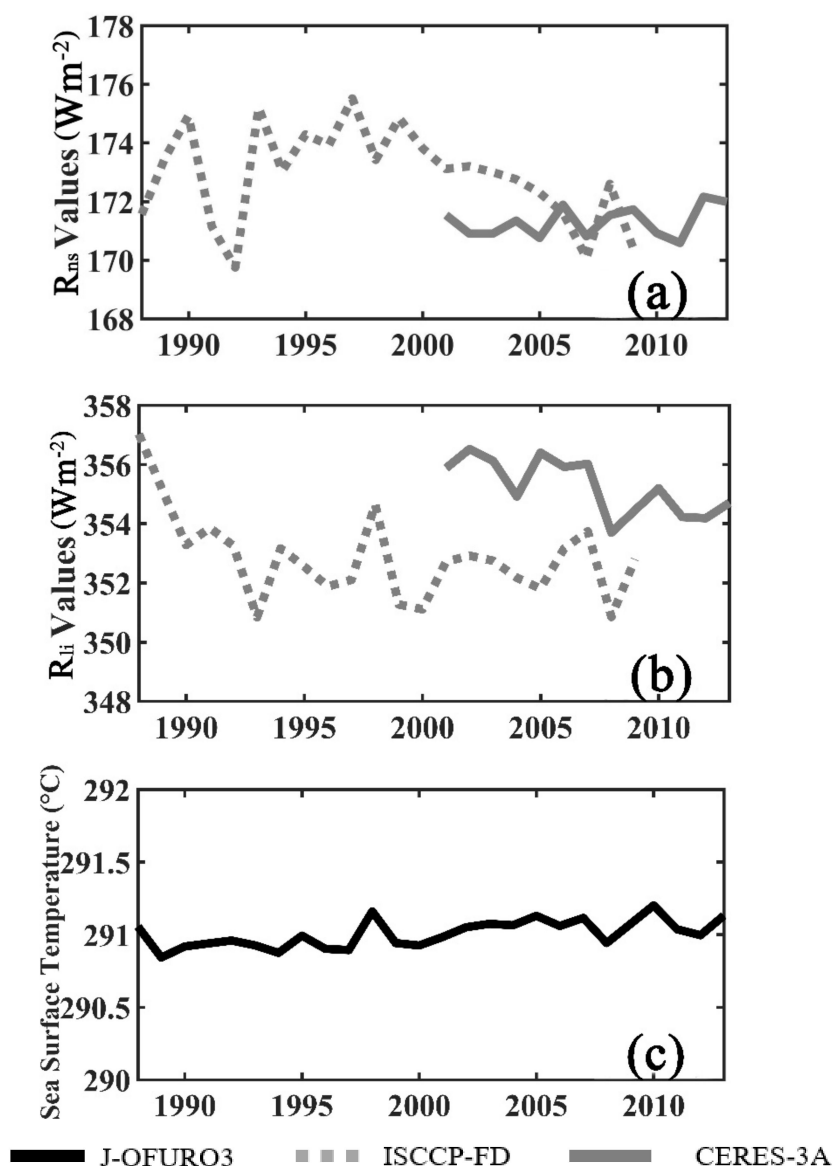


Figure 8. Interannual variations in the annual mean sea-surface (a) R_{ns} , (b) R_{li} , and (c) SST values from 1988 to 2013 in the J-OFURO3, ISCCP-FD, and CERES-3A datasets over the global ice-free oceans.

3.2.2. Inconsistency Correction

As described in Section 2.2, the pixels with the inconsistency observed in the J-OFURO3 sea-surface R_n time series in approximately 2000 were determined and then were addressed by correcting their R_{ns} and R_{li} values from the ISCCP-FD product before 2000 (1988–1999) to those from the CERES-3A product according to Equation (4). Figure 9 presents all pixels that needed to be corrected in J-OFURO3.

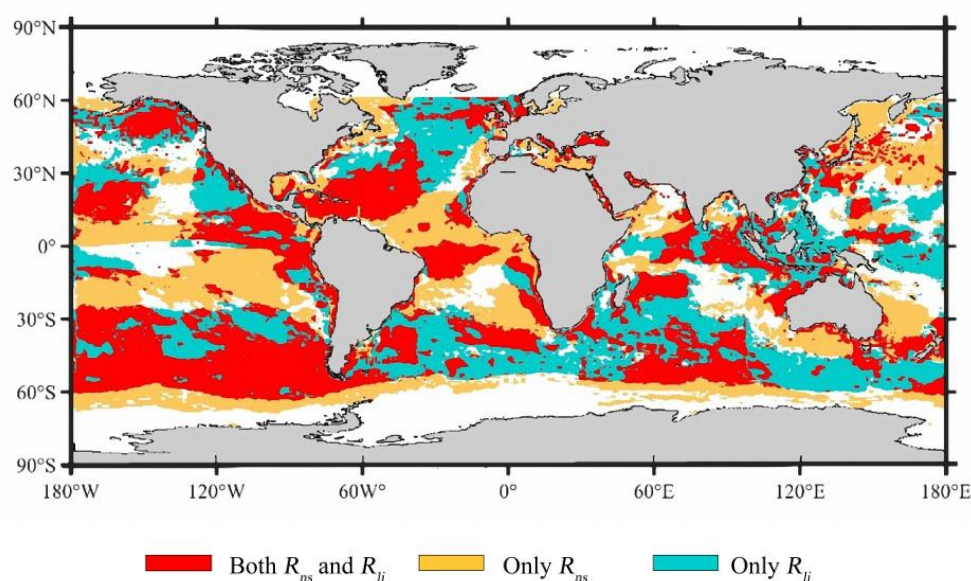


Figure 9. The determined pixels in the J-OFURO3 that needed to be corrected.

Figure 10a,b shows the interannual variations in the annual mean sea-surface R_{ns} or R_{li} over the global ice-free oceans before and after the inconsistency correction. Compared to the original values, the values of the corrected sea-surface R_{ns} and R_{li} and, thereby, the corrected R_n values before 2000 (the black line in Figure 10) were more consistent with the values after 2000 but without much change in their variation trends; specifically, the sharp increase in approximately 2000 caused by the changes in the input datasets was eliminated in the corrected time series. After correction and comparison with the original dataset, it was found that the inconsistency issues in the J-OFURO3 sea-surface R_n were caused by different radiative component at different regions (Figure 11). Overall speaking, the inconsistency in R_n over the seas within the tropical region (20°N – 20°S) was mainly caused by the inconsistent R_{ns} (Figure 11a); while the inconsistency in R_{li} lead to the inconsistent R_n over the seas for other regions (Figure 11b,c). Moreover, it shows that the corrected results before 2000 for all regions consistent with the sea-surface R_n values after 2000 very well with little changes in their variations.

The direct validation results in Figure 12 indicated that the uncertainties in the J-OFURO3 sea-surface R_n during 1988–2000 decreased significantly by reducing RMSD from 39.03 to 38.59 Wm^{-2} and bias from 4.67 to 0.27 Wm^{-2} respectively after correction. Taking one moored buoy site UOP-SUB-SE (18.0°N , 22.0°W) as an example, Figure 13 shows that the variations in the monthly sea-surface R_n time series from the corrected J-OFURO3 in 1992 were closer to the in situ R_n than the original J-OFURO3. Therefore, the inconsistency correction method was so effective that the corrected J-OFURO3 sea-surface R_n values performed more reasonably.

However, note that the correction method proposed in this study only addressing the discontinuity issues occurring around 2000 resulted from the inputs replacement, while the other inconsistency appearing at mid–high latitude seas in approximately 2007 (Figure 11) caused by CERES-3A [38] was not addressed in this study.

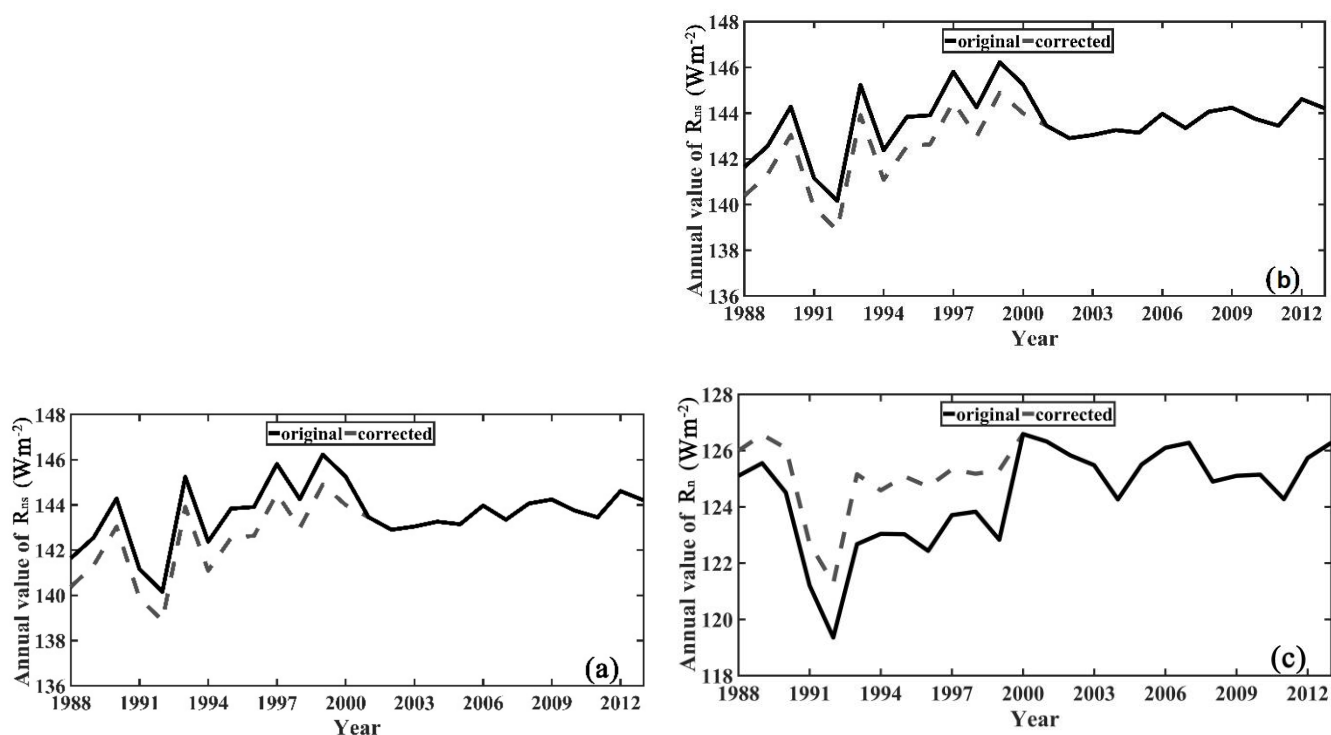


Figure 10. Interannual variations in the annual mean sea-surface (a) R_{ns} , (b) R_{li} , and (c) R_n from 1988 to 2013, from the original and corrected J-OFURO3 over global ice-free oceans.

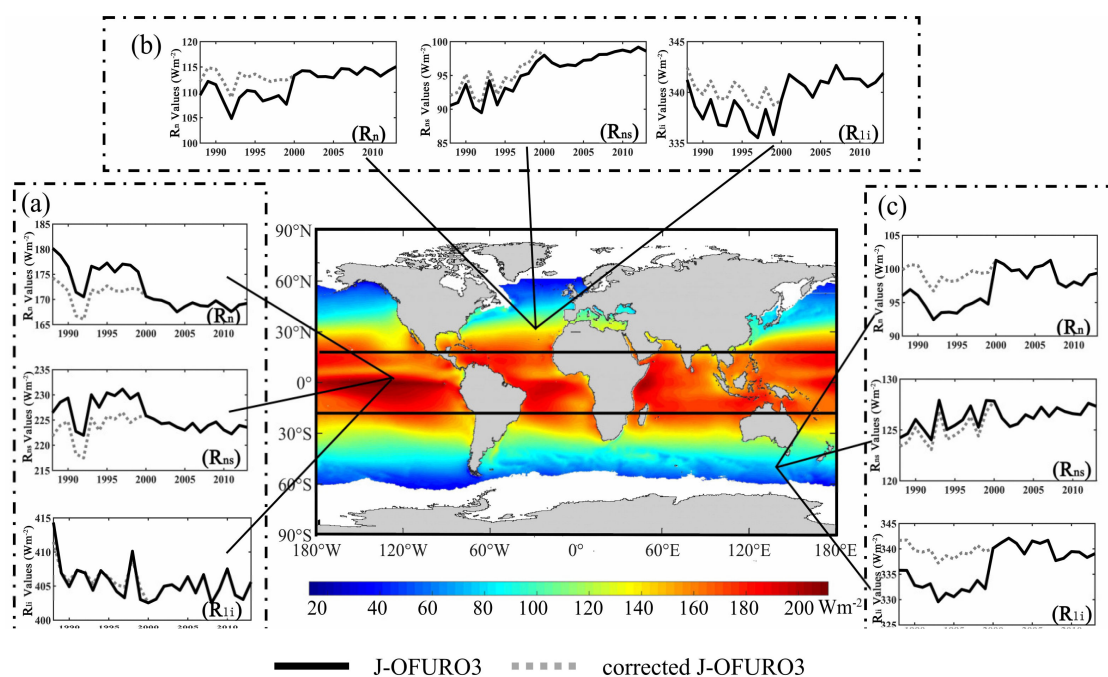


Figure 11. Interannual variations in the average annual mean sea-surface R_n , R_{ns} , and R_{li} for three regions: (a) 20°S – 20°N , (b) north of 20°N , and (c) south of 20°S from 1988 to 2013 for J-OFURO3 and corrected J-OFURO3, respectively.

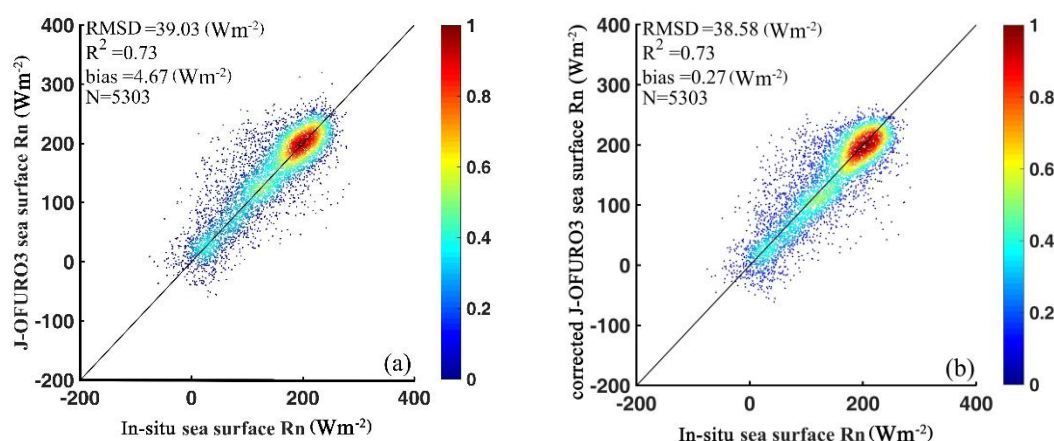


Figure 12. Scatter plots between the J-OFURO3 daily sea-surface R_n and the in situ R_n , from 1988 to 2000, before (a) and after (b) inconsistency correction.

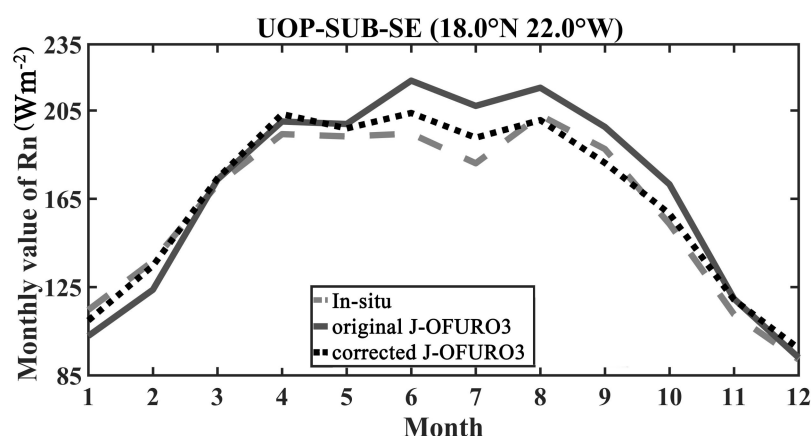


Figure 13. Times series variations in the monthly sea-surface R_n in 1992 from the original corrected J-OFURO3 data and the in situ R_n at the UOP-SUB-SE moored buoy site (18° N, 22° W).

3.3. Spatiotemporal Trend Analysis Based on the Corrected J-OFURO3 Sea-Surface R_n Values

The spatiotemporal variations in the annual mean sea-surface R_n over the tropical seas (20° N– 20° S) from 1988 to 2013 were analyzed based on the corrected J-OFURO3, using the linear regression model. For comparison, the spatiotemporal analysis was also conducted on the sea-surface R_n from the original J-OFURO3 and ERA5, and all results are given in Figure 14.

Comparing with the other two datasets, the results from the corrected J-OFURO3 dataset (Figure 14a) were more consistent with the results from the ERA5 dataset (Figure 14c), which was similar to previous studies [39,40], but it had a large discrepancy with the results from the original J-OFURO3 dataset (Figure 14b), especially in the regions with increasing trends shown in Figure 14a,c. Therefore, this result again emphasized the importance and necessity of correcting the inconsistency in the original J-OFURO3 sea-surface R_n time series. Specifically, based on the results obtained from the corrected J-OFURO3, the sea-surface R_n increased at a mean rate of 0.257 Wm^{-2} over most regions of the Western and Central Tropical Pacific, which was consistent with the studies of Liu [39] and Cook [40]. According to Cook [40], the increased sea-surface R_n in this region was possibly caused by the increased R_{ns} , which were resulted from the decreased cloud amounts and the enhanced aerosol distributions or reduced water vapor droplet size. It was also seen that the sea-surface R_n over the Eastern Tropical Pacific mostly decreased at a mean rate of 0.316 Wm^{-2} per year, which was possibly caused by the decreased top-of-atmosphere (TOA) R_n within the same region as discussed by Allan [41]. The decreased sea-surface R_n

would enhance the sea-surface cooling and then enhance TOA albedo, therefore further enhancing the reflected shortwave radiation and reducing the net downward energy flux radiation [42], which could explain the recent slowing rate of global surface temperature rise in this region [43,44]. Moreover, another area worth noting is the Northern Indian Ocean, where the mean trend in the J-OFURO3 sea-surface R_n changed from decreasing at a rate of 0.395 Wm^{-2} per year to increasing at a rate of 0.288 Wm^{-2} per year after correction and this was similar to ERA5 and more reasonable. According to the studies by Arora [45], the sea-surface R_n over the Tropical Indian Ocean has shown a rise trend in the recent decade because of the increased SST in this region caused by the anomalous cyclonic circulations on either side of equator and anomalous easterlies along the Tropical Pacific Ocean resulted from the weakened relation between the Indian Ocean and the Pacific Ocean [46]. Therefore, the corrected J-OFURO3 could not only provide correct tempo-spatial variations in the sea-surface R_n , but also more information on the regions different from the one from ERA5.

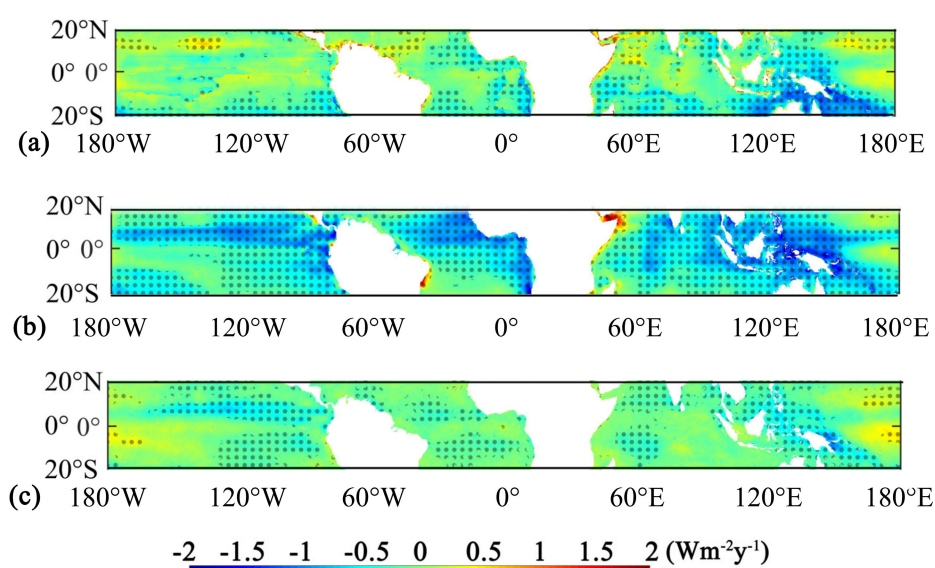


Figure 14. Spatiotemporal variations in the annual mean sea-surface R_n during 1988 to 2013 by linear regression model for (a) the corrected J-OFURO3, (b) the original J-OFURO3, and (c) the ERA5. The pixels marked with a dot indicate their statistical significance, with the p -values ≤ 0.14 .

4. Conclusions

The sea-surface R_n values obtained from a new satellite-based dataset, J-OFURO3, with a 0.25° spatial resolution from 1988 to 2013, were objectively assessed in this study. Observations collected from 55 global moored buoys in five measuring networks from 1988 to 2013 were applied to evaluate the performances of the daily and monthly J-OFURO3-derived sea-surfaces R_n values; then the inconsistency problems in the J-OFURO3 sea-surface R_n time series in approximately 2000 were deeply explored. Finally, a simple but effective correction method was developed and conducted. Based on all the results, some major conclusions were drawn.

1. The uncertainties in the J-OFURO3 sea-surface R_n were accepted, with overall R^2 values of 0.86 and 0.96, RMSD values of 24.05 and 10.76 Wm^{-2} , and biases of 0.16 and 0.22 Wm^{-2} at daily and monthly scales, respectively.
2. An abrupt increase appearing in approximately 2000 in the J-OFURO3 sea-surface R_n time series was very possibly caused by the replacement of the input data sources from the ISCCP-FD dataset to the CERES-3A dataset.
3. A simple correction method is proposed by regressing the radiative components (R_{ns} and R_{li}) from the ISCCP-FD dataset to those from the CERES-3A dataset separately,

pixel by pixel, and the uncertainties in the sea-surface R_n were decreased remarkably by reducing the bias from 4.67 to 0.27 Wm^{-2} after correction.

4. The tempo-spatial variations in the J-OFURO3 sea-surface R_n were more reasonable after correction especially over tropical seas.

In summary, the performance of the J-OFURO3 sea-surface R_n time series was generally satisfactory, with a relative low uncertainty, and has significant potential for wide uses in various applications. However, the limitations in this product, for example, its limited coverage (only for ice-free seas), its poor performance in the near-coastal areas, and especially the inconsistency issues cannot be ignored. It is also suggested that the correction method proposed in this study should be conducted before this product is used. More efforts are needed to improve the quality of J-OFURO3. Moreover, reliable and long-time-series sea-surface R_n data with high accuracy and spatiotemporal resolution are urgently required.

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