

On the Best Settings to Calculate Ionospheric Irregularity Indices From the *In Situ* Plasma Parameters of CSES-01

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Abstract—Electron density (N_e) and temperature (T_e) values recorded by the Langmuir probe onboard the first satellite of the China Seismo-Electromagnetic Satellite (CSES-01) mission allow calculating quantities such as the rate of change of electron density index (RODI) and the rate of change of electron temperature index (ROTEI), which are essential to describe the ionospheric irregularities and their dynamics. These two indices depend significantly on two parameters, i.e., the measurement sampling time and the width of the sliding windows used for their computation. N_e and T_e measurements from CSES-01 present two different sampling times, i.e., 3 s in the survey mode and 1.5 s in the burst mode. The purpose of this article is to understand what are the best values of these two parameters to be used when computing RODI and ROTEI based on CSES-01 data. The main results of the study show the following: The shorter the data sampling time, the higher the values of the calculated ionospheric indices, which means that it is not possible to merge values of either RODI or ROTEI calculated with a different sampling time; the wider the sliding window used to calculate the indices, the higher the indices. A reasonable compromise between the data sampling time and the satellite orbital velocity suggests that the optimal way to calculate RODI and ROTEI from CSES-01 should be done by considering data with a 3-s sampling time (i.e., in the survey mode or in the downsampled burst mode), and a 24-s wide sliding window.

Index Terms—CSES-01 satellite, ionospheric indices, Langmuir probe data, topside ionosphere.

I. INTRODUCTION

THE distribution and dynamics of the topside ionospheric plasma exhibit variations on really different spatial and

temporal scales (e.g., [1]–[3]). Specifically, the scale size of ionospheric irregularities ranges from submeters to thousands of kilometers [4], [5]. At large scales, the topside electron density (N_e) and temperature (T_e) behaviors are well described by empirical ionospheric models, like the International Reference Ionosphere (IRI; [6]). Instead, at small scales, the N_e and T_e behaviors can be investigated through the calculation of specific indices based on *in situ* observations from instruments onboard low-Earth-orbit satellites, such as the rate of change of electron density index (RODI; [7]) and the rate of change of electron temperature index (ROTEI; [8], [9]). These two indices allow identifying a large spectrum of irregularities, which characterize both the high latitudes (e.g., [10]–[13]) and the low latitudes (e.g., [14]–[16]).

The *in situ* measurements performed by the Langmuir probe (LAP) onboard CSES-01, the first satellite of the China Seismo-Electromagnetic Satellite (CSES, also called ZhangHeng-1, ZH-1) mission [17], are considered with two different sampling times, i.e., 3 s in the survey mode and 1.5 s in the burst mode. As we were willing to calculate ionospheric indices from CSES data, the following questions arose: How a different sampling time affects them? More specifically, can indices computed in burst and survey modes be merged? How do they depend on the width of the sliding window used in their computation? The present study aims at answering all these questions. Concerning the last one, it is well known that the width of the sliding window is a crucial parameter for the detection of fluctuations on different spatial and temporal scales. When the sampling time is either 1 s or 0.5 s, as is the case of the Swarm mission [18], a good compromise is to select a 10-s wide sliding time window, as was done, for instance, in [7], [13], and [19]. However, CSES-01 presents longer sampling times, which prompted us to do a more in-depth study to understand what is the optimal sliding time window width to calculate both RODI and ROTEI starting from CSES-01 data. CSES-01 LAP N_e and T_e measurements were recently compared to those recorded by Swarm and DEMETER satellites, the Millstone Hill incoherent scatter radar, and values modeled by the IRI empirical model [20]–[22]. Overall, these preliminary comparisons identified some differences in the N_e and T_e magnitude among the different datasets, but their quite similar spatial and seasonal patterns make CSES-01 data very promising for ionospheric studies.

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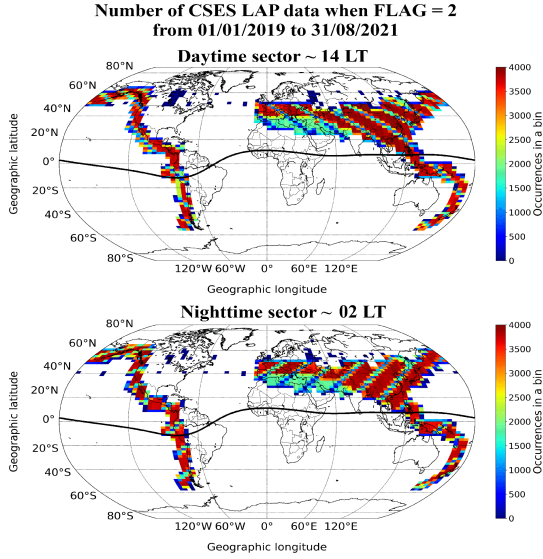


Fig. 1. CSES-01 LAP data recorded in the burst mode (FLAG = 2) from January 1, 2019 to August 31, 2021, and plotted in geographic coordinates. The color scale represents the number of measurements in each bin (bins are 2° wide in latitude and 4° wide in longitude). The top panel is for the daytime sector (~ 14 LT) and the bottom panel is for the nighttime sector (~ 02 LT). The black curve in both panels represents the geomagnetic equator.

Section II will describe the data and methods used. Section III will describe how different sampling times affect the computed ionospheric indices, whereas Section IV will describe how different sliding time window widths affect the computed ionospheric indices. The summary and conclusions are the subjects of Section V.

II. DATA AND METHODS

CSES-01 is a Sun-synchronous satellite flying with an orbital inclination of 97.4° , an altitude of ~ 500 km, and descending and ascending nodes are at ~ 14 local time (LT) and ~ 02 LT, respectively. The main scientific objective of the CSES mission is to get data on the ionospheric environment to monitor and study perturbations possibly associated with earthquake activity [17]. Anyway, its payload is valuable to perform wider studies linked to the topside ionosphere. In this work, Ne and Te data measured by LAP [23], [24] from January 1, 2019, to August 31, 2021, have been considered. These consist of Level-2 calibrated data with a sampling time of 3 s in the survey mode (identified as FLAG = 1) and a sampling time of 1.5 s in the burst mode (identified as FLAG = 2), the latter being available only for definite regions of the terrestrial globe (see Fig. 1). CSES-01 data are recorded only in a geographical latitudinal range mainly between 70°S and 70°N , so they are not representative of high latitudes.

RODI values can be derived from Ne measurements by applying the procedure described in [8]. As a first step, the rate of change of electron density (ROD) is calculated as the time derivative of Ne along the satellite's orbit. Ne values are continuous time series for a specific semiorbit, with a defined sampling time (survey or burst mode depending on the location).

By indexing with k the contiguous measured values recorded at different times t_k , the k th ROD value is calculated as follows:

$$\text{ROD}_k = \frac{Ne_{k+1} - Ne_k}{t_{k+1} - t_k} \quad (1)$$

where Ne_k is the electron density measured at time t_k . In order to exclude the effect of possible gaps in Ne data, ROD values are calculated only for time-consecutive measurements, i.e., when the condition $(t_{k+1} - t_k) = \Delta t = 3$ s (or 1.5 s) is met.

The second step consists of organizing the calculated ROD values in windows of width ΔT centered at time t_k , sliding along the satellite's orbit. For each window, the arithmetic mean of ROD at time t_k is calculated by considering all the values falling inside the window and then between $(t_k - \Delta T/2)$ and $(t_k + \Delta T/2)$

$$\overline{\text{ROD}}_k = \frac{1}{N} \sum_{i=-j}^j \text{ROD}_{k+i} \quad (2)$$

where ROD_{k+i} are ROD values falling inside the rectangular window of width ΔT centered at time t_k and containing $N = 2j + 1$ values.

Finally, the RODI value at time t_k is calculated as the standard deviation of the ROD values inside the window

$$\text{RODI}_k = \sqrt{\frac{1}{N-1} \sum_{i=-j}^j (\text{ROD}_{k+i} - \overline{\text{ROD}}_k)^2} \quad (3)$$

RODI is calculated only when at least half of the maximum number of occurrences that could fall in a window are actually present; otherwise, the window sample is considered not statistically significant and discarded. For example, if $\Delta T = 30$ s and $\Delta t = 3$ s (survey mode), at most 11 ROD values fall in the window and at least 6 ROD values are needed for the RODI calculation.

Recently, in [8], the ROTEI index is introduced by applying the same mathematical approach to Te values. As a consequence, ROTEI is defined as the standard deviation of the rate of change of electron temperature (ROTE) values inside a window sliding along the satellite's orbit and is calculated by applying (1)–(3) to Te values. Specifically

$$\text{ROTE}_k = \frac{Te_{k+1} - Te_k}{t_{k+1} - t_k} \quad (4)$$

where Te_k is the electron temperature measured at time t_k and

$$\overline{\text{ROTE}}_k = \frac{1}{N} \sum_{i=-j}^j \text{ROTE}_{k+i} \quad (5)$$

where ROTE_{k+i} are ROTE values falling inside a window of width ΔT centered at t_k and containing $N = 2j + 1$ values. Finally, the ROTEI value at time t_k is calculated as the standard deviation of the ROTE values inside the window

$$\text{ROTEI}_k = \sqrt{\frac{1}{N-1} \sum_{i=-j}^j (\text{ROTE}_{k+i} - \overline{\text{ROTE}}_k)^2} \quad (6)$$

Since the width of the window is crucial for detecting fluctuations of different spatial and temporal scales, in the next sections,

2020/07/25, 03:41:06-04:18:30 UT, descending orbit, day

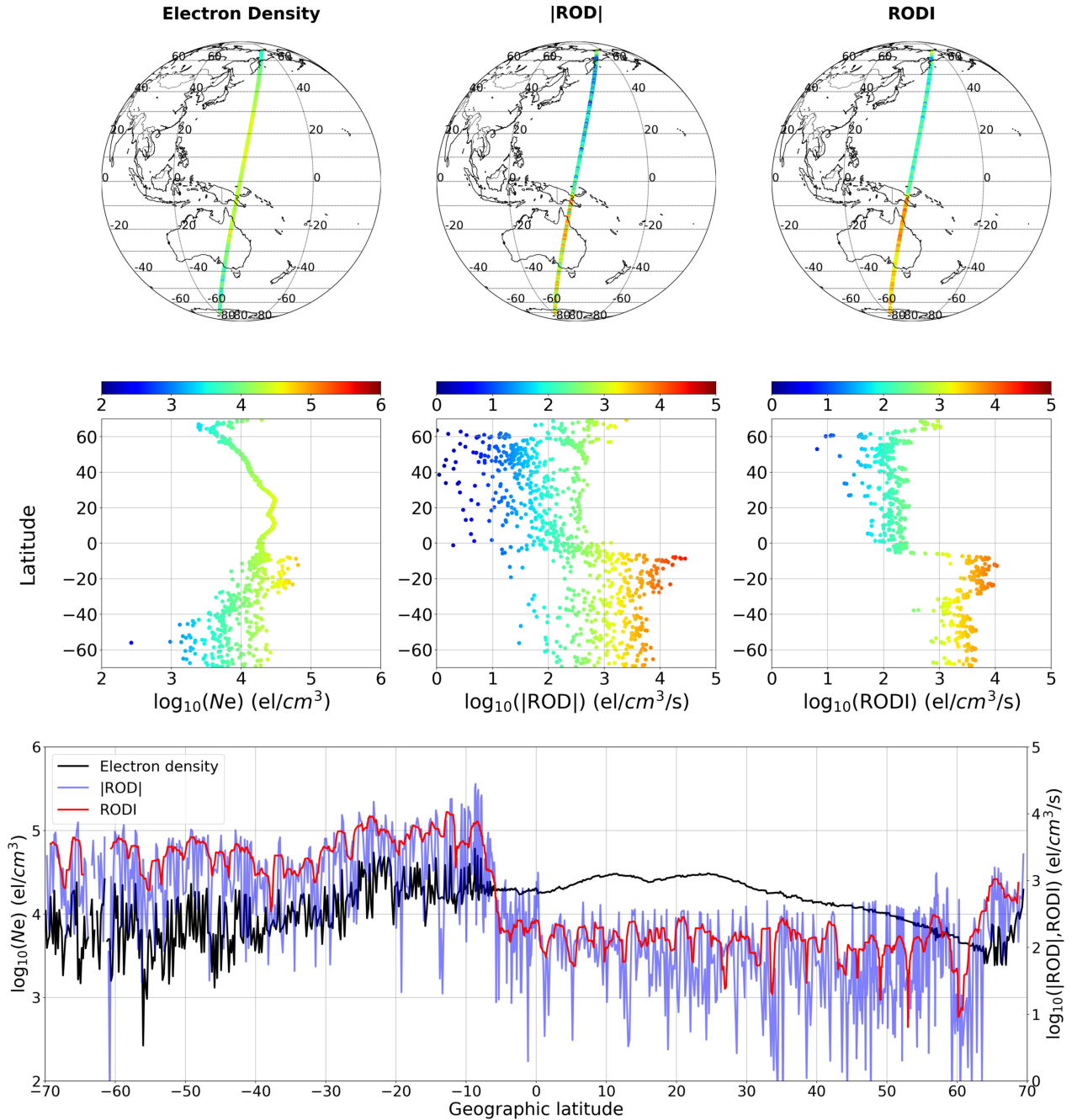


Fig. 2. Electron density (left column), $|ROD|$ (where ROD is calculated through (1), middle column), and $RODI$ (right column) values recorded by CSES-01 on July 25, 2020, between 03:41 UT and 04:18 UT, for a descending orbit in the daytime sector (~ 14 LT). Data are represented in geographic maps (top row) and as separated (middle row) and superposed (bottom row) time series. In the top and middle rows, data are represented as scatter points whose color identifies the corresponding magnitude (in logarithmic scale). In the bottom row, data are represented as curves of different colors: black for N_e , light blue for $|ROD|$, and red for $RODI$.

we will investigate the use of windows with different ΔT values, i.e., encompassing a different number of ROD and $ROTE$ values.

Examples of $RODI$ and $ROTEI$ indices obtained from CSES-01 LAP observations recorded on July 25, 2020, during the main phase of a weak geomagnetic storm with a minimum Dst equal to -75 nT and a maximum K_p equal to 4, for a descending orbit in the daytime sector (~ 14 LT), are reported in Figs. 2 and 3. In

these cases, both indices were calculated with $\Delta T = 24$ s and $\Delta t = 3$ s. These figures clearly display the ability of both indices in catching small-scale variations in N_e and T_e , respectively. In fact, between about $5^\circ S$ and $70^\circ S$, large variations in the magnitude of both N_e and T_e cause steep increases in both $RODI$ and $ROTEI$ (the scale is logarithmic). Due to their mathematical definition, $RODI$ and $ROTEI$ describe the variability of N_e and

2020/07/25, 03:41:06-04:18:30 UT, descending orbit, day

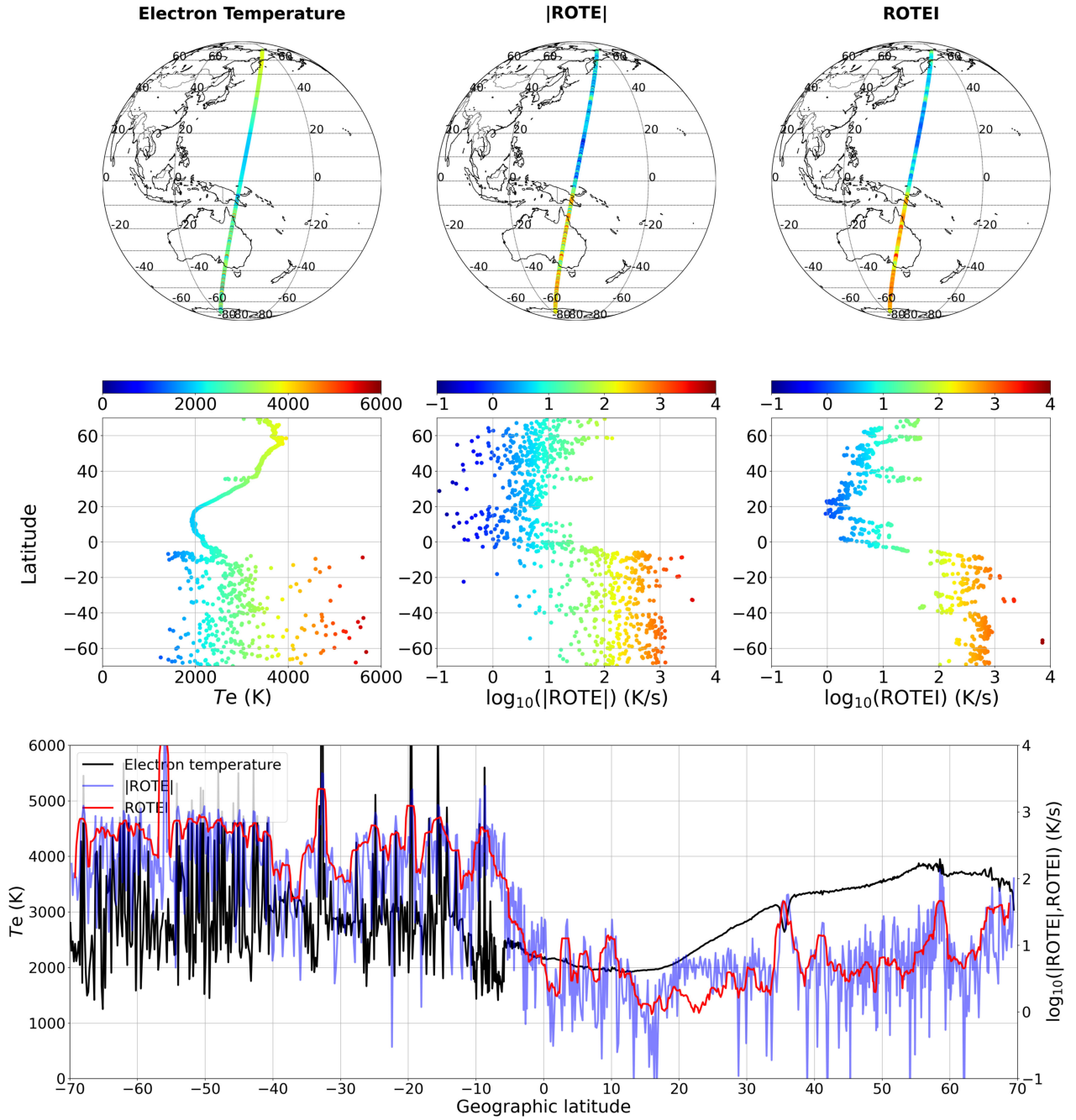


Fig. 3. Electron temperature (left column), $|ROTE|$ (where ROTE is calculated through (4), middle column), and ROTEI (right column) values recorded by CSES-01 on July 25, 2020, between 03:41 UT and 04:18 UT, for a descending orbit in the daytime sector (~ 14 LT). Data are represented in geographic maps (top row) and as separated (middle row) and superposed (bottom row) time series. In the top and middle rows, data are represented as scatter points whose color identifies the corresponding magnitude (in logarithmic scale). In the bottom row, data are represented as curves of different colors: black for T_e , light blue for $|ROTE|$, and red for ROTEI.

T_e at the scale of the window used for their calculation and are unaffected by large-scale variations. This is well visible in Figs. 2 and 3 by comparing the smooth trend characterizing the Northern hemisphere with the oscillating one characterizing the Southern hemisphere, which results in a difference of more than two orders of magnitude between the lowest and the highest values of RODI and ROTEI.

III. EFFECT OF DIFFERENT CSES-01 LAP SAMPLING TIMES ON THE IONOSPHERIC INDEX CALCULATION

By definition, the magnitude of both RODI and ROTEI depends on the observation sampling time Δt . To investigate the effect of different CSES-01 LAP sampling times, we here consider only data acquired in the burst mode (with a sampling time of 1.5 s) but use it to build a further dataset

Comparison between RODI calculated at different sampling times CSES data from 01/01/2019 to 31/08/2021, when FLAG = 2

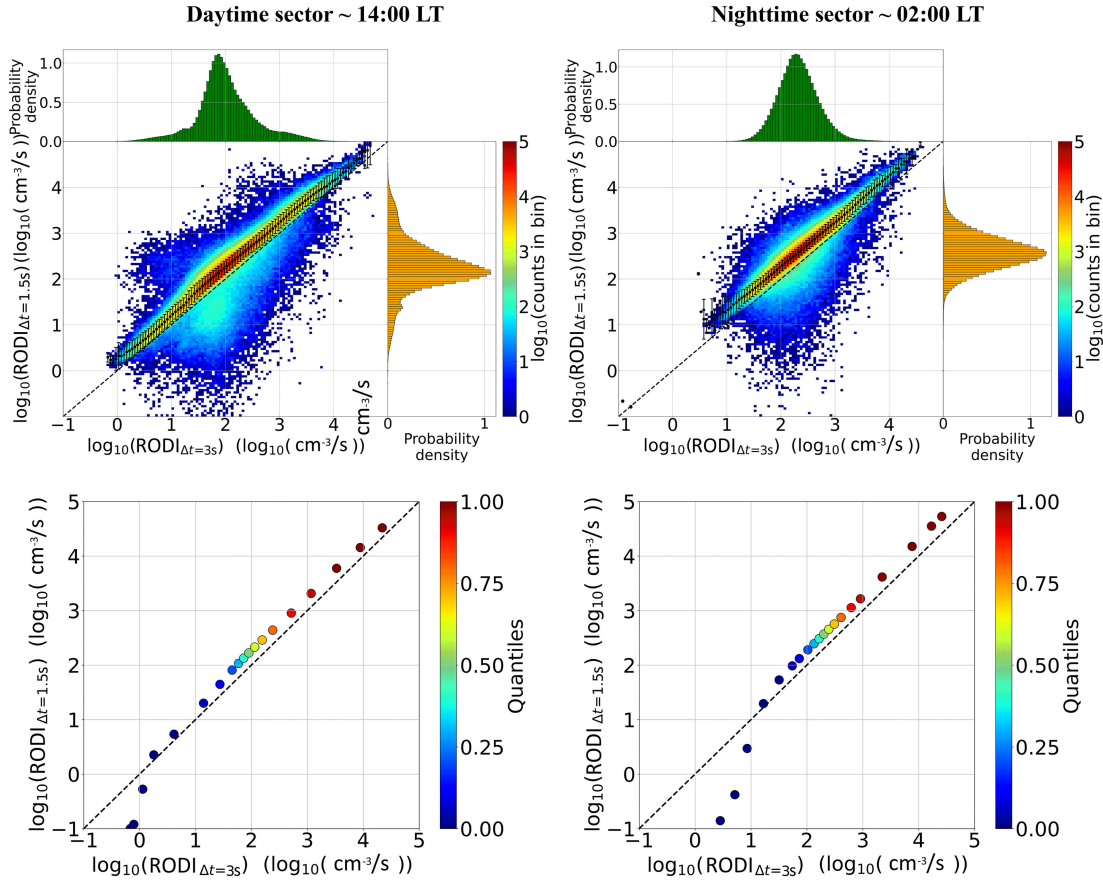


Fig. 4. (Top panels) Joint probability distribution of RODI values calculated with different sampling times: $\text{RODI}_{\Delta t=3s}$ on the x-axis, $\text{RODI}_{\Delta t=1.5s}$ on the y-axis. Black dots with error bars represent the mean and standard deviation of $\text{RODI}_{\Delta t=1.5s}$ conditioned by $\text{RODI}_{\Delta t=3s}$. CSES-01 data are those recorded from January 1, 2019, to August 31, 2021, in those regions where LAP measured in the burst mode (see Fig. 1). On the top and right of the distributions, histograms of the probability density for $\text{RODI}_{\Delta t=3s}$ and $\text{RODI}_{\Delta t=1.5s}$ are also reported. (Bottom panels) Q-Q plots between $\text{RODI}_{\Delta t=3s}$ and $\text{RODI}_{\Delta t=1.5s}$. The values of quantiles of both distributions are represented in color scale. The dashed lines represent the bisector of the first-third quadrant. Left panels refer to the daytime sector, whereas right panels refer to the nighttime sector. The considered window width is $\Delta T = 30$ s.

made of data characterized by a 3-s sampling time (obtained by downsampling the 1.5-s time series). Since, usually, both N_e and T_e exhibit variations at time scales lower than those probed by CSES-01 LAP, the two different sampling times produce different ROD and ROT values [through (1) and (4), respectively] and, consequently, also different RODI and ROTEL.

To test the effect of different sampling times on the index values, with a sliding window of fixed width, we selected the CSES-01 dataset measured in the burst mode and calculated RODI and ROTEL values with the following two specifications:

- 1) $\text{RODI}_{\Delta t=3s}$ and $\text{ROTEI}_{\Delta t=3s}$, i.e., RODI and ROTEL values obtained with $\Delta t = 3$ s and $\Delta T = 30$ s, and at most $N = 11$ values in the sliding window;
- 2) $\text{RODI}_{\Delta t=1.5s}$ and $\text{ROTEI}_{\Delta t=1.5s}$, i.e., RODI and ROTEL values obtained with $\Delta t = 1.5$ s and $\Delta T = 30$ s, and at most $N = 21$ values in the sliding window.

Fig. 4 shows the comparison between RODI values calculated according to the two aforementioned settings. The comparison is performed through the graphical representation of joint

probability distributions and quantile–quantile (Q–Q) plots of $\text{RODI}_{\Delta t=3s}$ and $\text{RODI}_{\Delta t=1.5s}$ values, for the two different LT sectors probed by CSES-01. In the joint probability distribution plots, the mean and standard deviation of $\text{RODI}_{\Delta t=1.5s}$ conditioned by $\text{RODI}_{\Delta t=3s}$ are also reported as black points and vertical bars, respectively. By looking at joint probability distribution plots, it is clear how $\text{RODI}_{\Delta t=1.5s} > \text{RODI}_{\Delta t=3s}$ for the bulk of dataset, with conditioned mean values above the bisector of the first-third quadrant (dashed line) in the entire range of calculated RODI values. The Q–Q plot is a scatterplot of two sets of quantiles that gives information on the similarity between the two distributions of data [25]. In fact, if both sets of quantiles came from the same distribution, they will distribute along a straight line. Fig. 4 shows that quantiles distribute along a straight line only above a certain RODI threshold value, whereas lower quantiles (those associated with the tail of the distribution concerning the lowest RODI values) depart from this behavior. As a consequence, the two distributions of $\text{RODI}_{\Delta t=3s}$ and $\text{RODI}_{\Delta t=1.5s}$ values can be considered quite similar, with

Comparison between ROTEI calculated at different sampling times CSES data from 01/01/2019 to 31/08/2021, when FLAG = 2

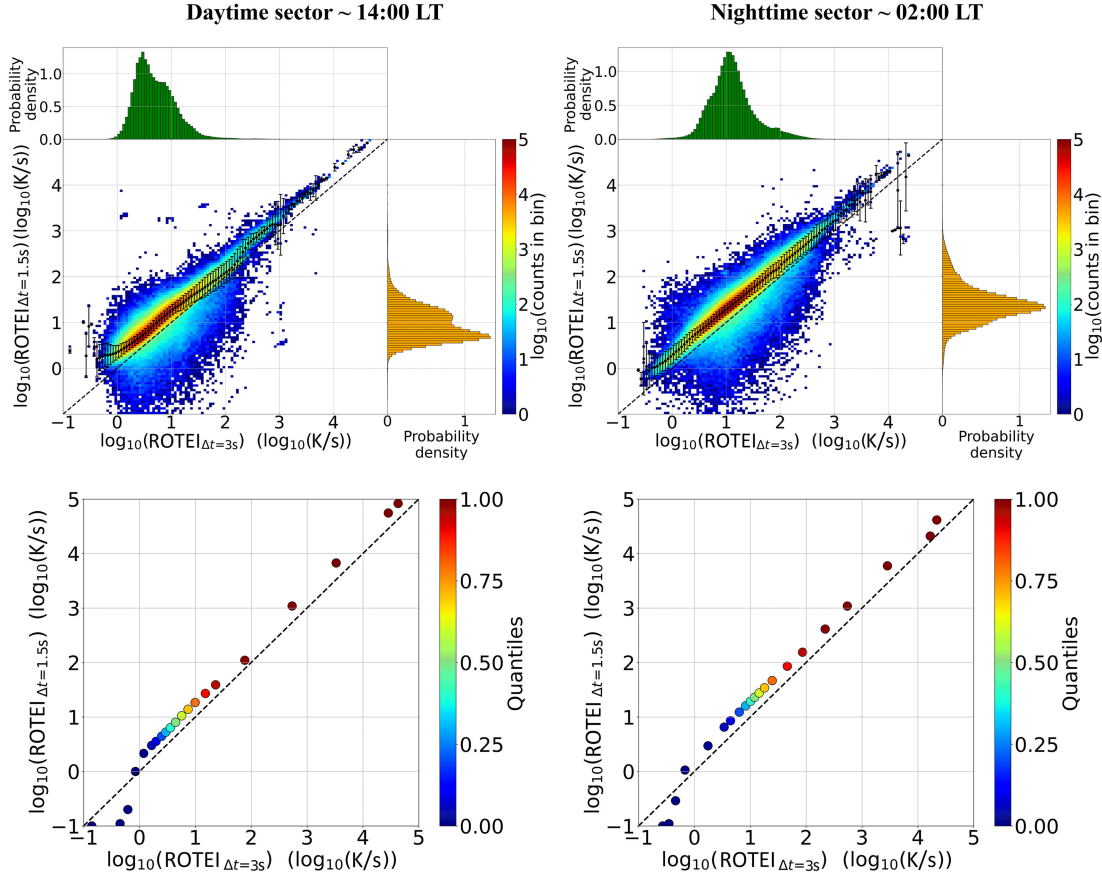


Fig. 5. (Top panels) Joint probability distribution of ROTEI values calculated with different sampling times: $\text{ROTEI}_{\Delta t=3s}$ on the x-axis, $\text{ROTEI}_{\Delta t=1.5s}$ on the y-axis. Black dots with error bars represent the mean and standard deviation of $\text{ROTEI}_{\Delta t=1.5s}$ conditioned by $\text{ROTEI}_{\Delta t=3s}$. CSES-01 data are those recorded from January 1, 2019 to August 31, 2021, in those regions where LAP measured in the burst mode (see Fig. 1). On the top and right of the distributions, histograms of the probability density for $\text{ROTEI}_{\Delta t=3s}$ and $\text{ROTEI}_{\Delta t=1.5s}$ are also reported. (Bottom panels) Q–Q plots between $\text{ROTEI}_{\Delta t=3s}$ and $\text{ROTEI}_{\Delta t=1.5s}$. The values of quantiles of both distributions are represented in color scale. The dashed lines represent the bisector of the first-third quadrant. Left panels refer to the daytime sector, whereas right panels refer to the nighttime sector. The considered window width is $\Delta T = 30$ s.

differences only at the tail of the lowest RODI values. Moreover, most of the $\text{RODI}_{\Delta t=1.5s}$ quantiles are higher than $\text{RODI}_{\Delta t=3s}$ ones (they are above the bisector of the first-third quadrant), as already highlighted by the joint probability distribution plots. To sum up, the shorter the data sampling time, the higher the calculated RODI values, with the corresponding distributions being very similar except for the very low quantiles, which are related to low RODI values that are few and those we are least interested in.

Fig. 5 shows the same analysis as in Fig. 4 but for ROTEI. Corresponding results are very similar to those obtained for RODI and confirm that the shorter the data sampling time, the higher the calculated ionospheric index values. This result is similar to that found by Li *et al.* [26] in their analyses finalized to look for seismological ionospheric signatures. This means that both N_e and T_e exhibit variability at time scales smaller than those probed by CSES-01 LAP.

The results of this analysis highlight that it is not possible to merge values of RODI or ROTEI calculated with different

sampling times because their magnitude is sensibly different. This is highlighted also in Fig. 6, which is an example of median daytime RODI values, with both a sampling time of 1.5 s and a sampling time of 3 s (obtained by downsampling the 1.5-s time series), calculated only in the region where the satellite records in the burst mode. As a consequence, in the following analyses, RODI and ROTEI will be calculated with a fixed sampling time $\Delta t = 3$ s. In this way, RODI and ROTEI values obtained in both survey and burst modes are comparable and the entire CSES dataset (both FLAGS) can be used.

IV. EFFECT OF DIFFERENT TIME WINDOW WIDTHS ON THE IONOSPHERIC INDEX CALCULATION

To investigate the effect that the width ΔT of the sliding window has on the index magnitude, we calculated RODI and ROTEI by using windows of different widths and fixing the sampling time to $\Delta t = 3$ s, for the entire CSES-01 LAP dataset.

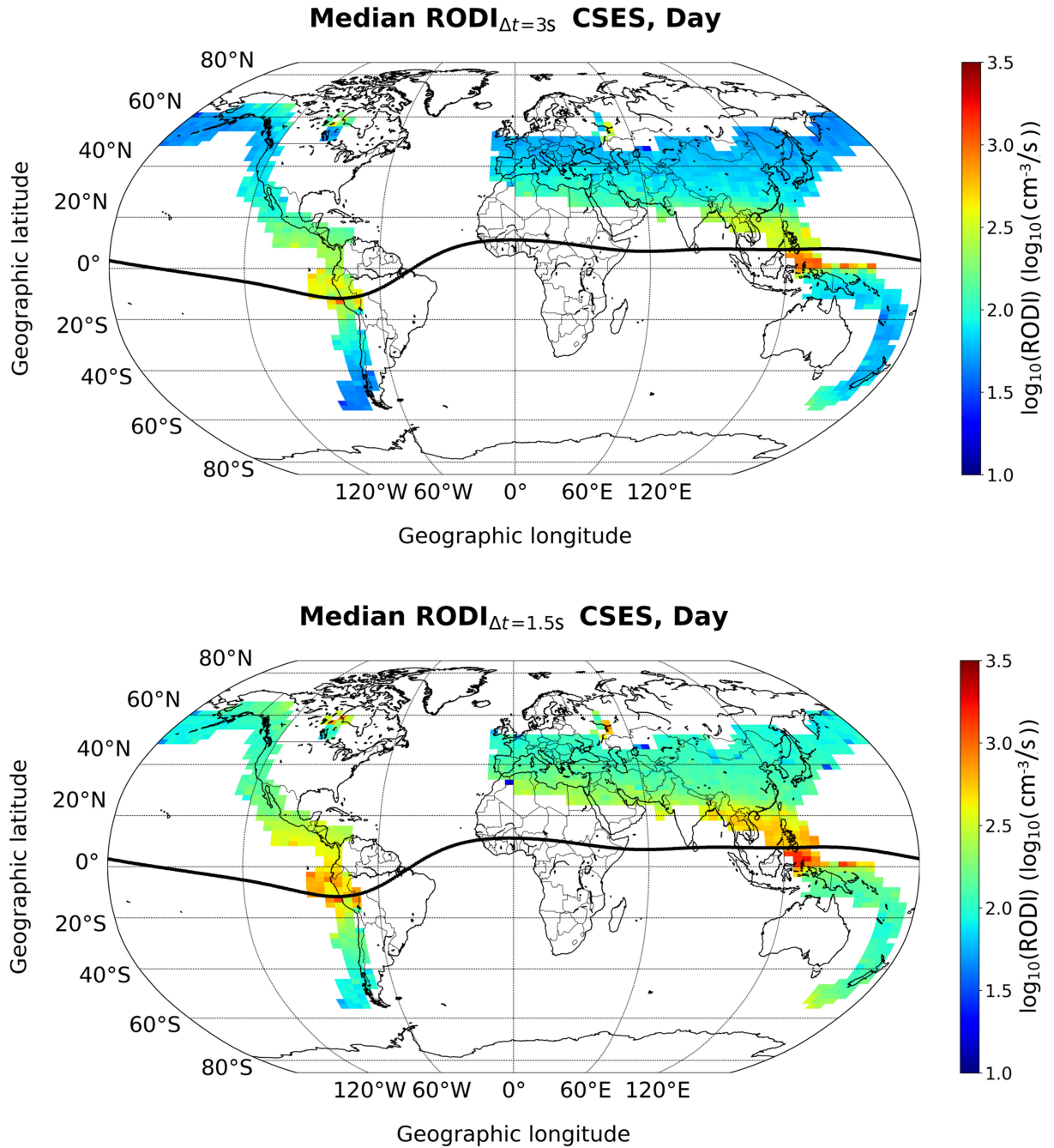


Fig. 6. Median RODI calculated from January 1, 2019 to August 31, 2021, for the daytime sector (~ 14 LT) in the regions where CSES-01 LAP data have been recorded in the burst mode (FLAG = 2) and plotted in geographic coordinates. The top panel refers to a sampling time of 3 s (obtained by downsampling the 1.5-s time series), whereas the bottom panel refers to a sampling time of 1.5 s. Bins are 2° wide in latitude and 4° wide in longitude. The black curve in both panels represents the geomagnetic equator. The figure for the nighttime sector can be found in the Supplementary Material.

This means that we considered all survey mode data and burst mode data downsampled at 3 s.

Specifically, we tested seven windows of width $\Delta T = [12, 18, 24, 30, 36, 42, \text{ and } 48]$ s. Then, seven RODI and ROTELI datasets were obtained. To compare them, we applied the same analysis shown in Figs. 4 and 5 by putting the dataset obtained with $\Delta T = 30$ s on the x -axis and the ones obtained with different ΔT values on the y -axis. This means that the differences among RODI and ROTELI values obtained with different ΔT

values are evaluated by taking $\Delta T = 30$ s as a touchstone. Corresponding comparisons are shown in Figs. 7–10 for both RODI and ROTELI, for the daytime sector. The corresponding analyses related to the nighttime sector can be found in the Supplementary Material.

Figs. 7–10 highlight the effect that the use of windows of different widths has on the index calculation. In fact, as it is well testified by the data distribution compared to the bisector of the first-third quadrant in the joint probability distribution

Comparison between RODI calculated with windows of different width

CSES data from 01/01/2019 to 31/08/2021, FLAG = 1 & 2, $\Delta t = 3$ s, Daytime sector $\sim 14:00$ LT

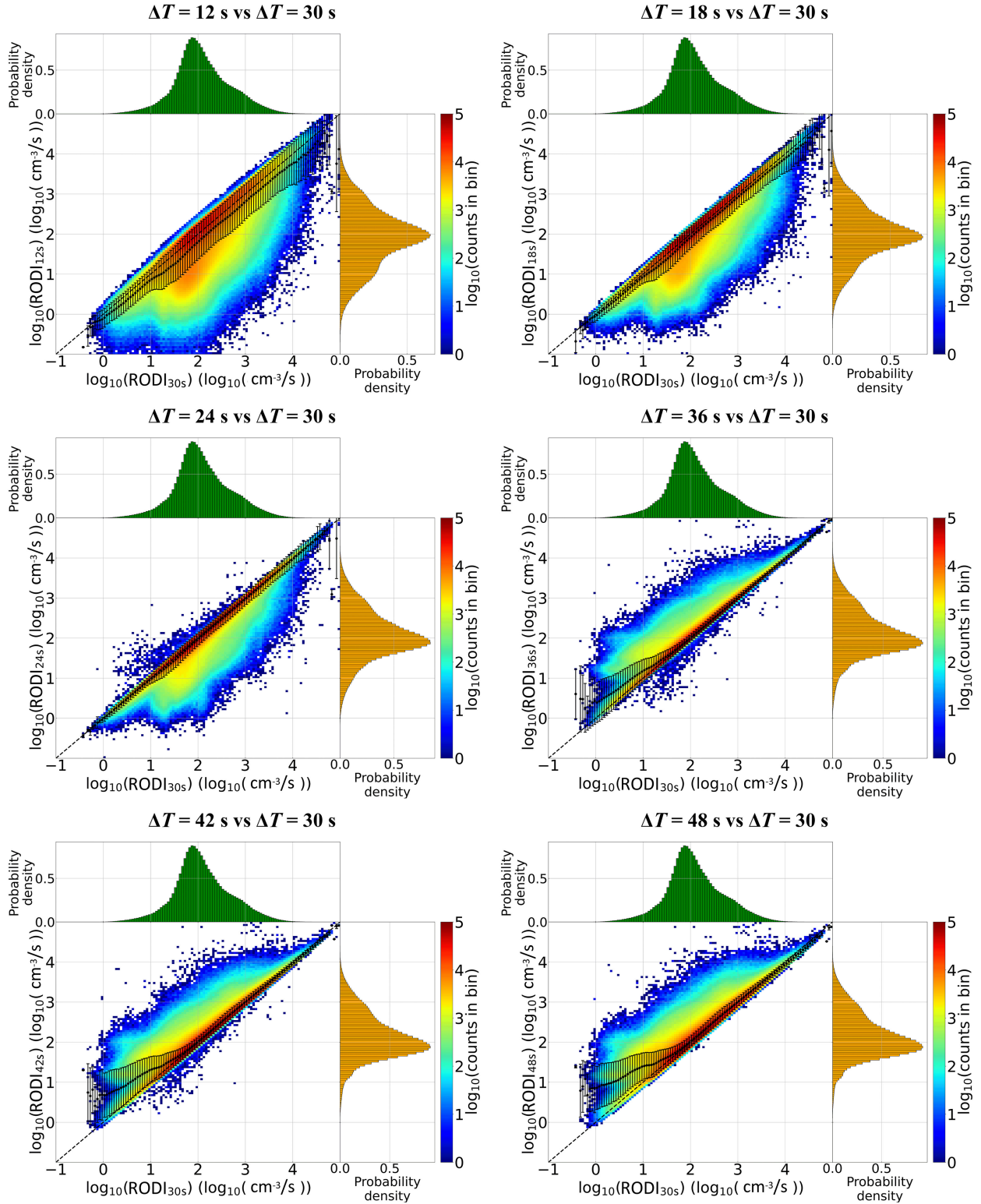


Fig. 7. Joint probability distribution of RODI values calculated with the sampling time fixed to $\Delta t = 3$ s. In each of the six panels, the RODI dataset calculated with $\Delta T = 30$ s (RODI_{30s}) is reported on the x-axis, whereas RODI datasets for different ΔT values are reported on the y-axis. CSES-01 LAP data are those recorded from January 1, 2019, to August 31, 2021, for the daytime sector.

Comparison between RODI calculated with windows of different length

CSES data from 01/01/2019 to 31/08/2021, FLAG = 1 & 2, $\Delta t = 3$ s, Daytime sector ~ 14 LT

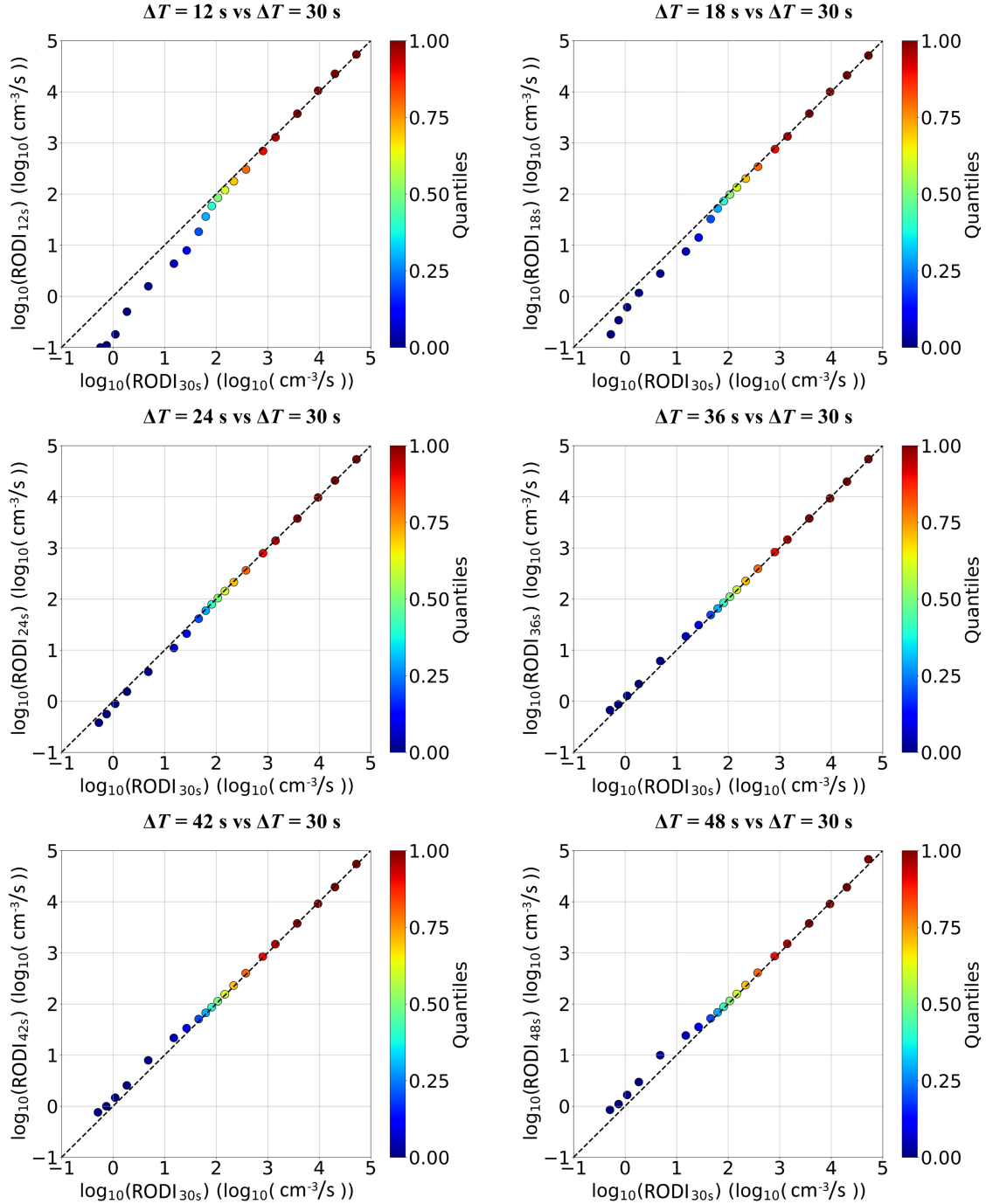


Fig. 8. Q-Q plots of RODI values calculated with the sampling time fixed to $\Delta t = 3$ s. In each of the six panels, the RODI dataset calculated with $\Delta T = 30$ s ($\text{RODI}_{30\text{s}}$) is reported on the x-axis, whereas RODI datasets for different ΔT values are reported on the y-axis. CSES-01 LAP data are those recorded from January 1, 2019, to August 31, 2021, for the daytime sector.

plots, the wider the window, the higher the calculated indices. When $\Delta T < 30$ s, a portion of data distribute below the bisector of the first-third quadrant, which means that $\text{RODI}_{[12,18,24]\text{s}} < \text{RODI}_{30\text{s}}$; the reverse is true when $\Delta T > 30$ s (which means that $\text{RODI}_{[36,42,48]\text{s}} > \text{RODI}_{30\text{s}}$). A similar behavior holds also for ROTEI. By looking at Q-Q plots, we can see that the effect

of the window width change is clear above all at the tails of the distributions. Overall, slight differences are visible for the ranges $\Delta T \in [24, 36]$ s, so the three options (24, 30, and 36 s) can be considered rather equivalent. Instead, a further decrease or increase in the window width produces larger differences above all at the tails of the distributions. CSES-01 satellite moves at

Comparison between ROTEI calculated with windows of different width

CSES data from 01/01/2019 to 31/08/2021, FLAG = 1 & 2, $\Delta t = 3$ s, Daytime sector $\sim 14:00$ LT

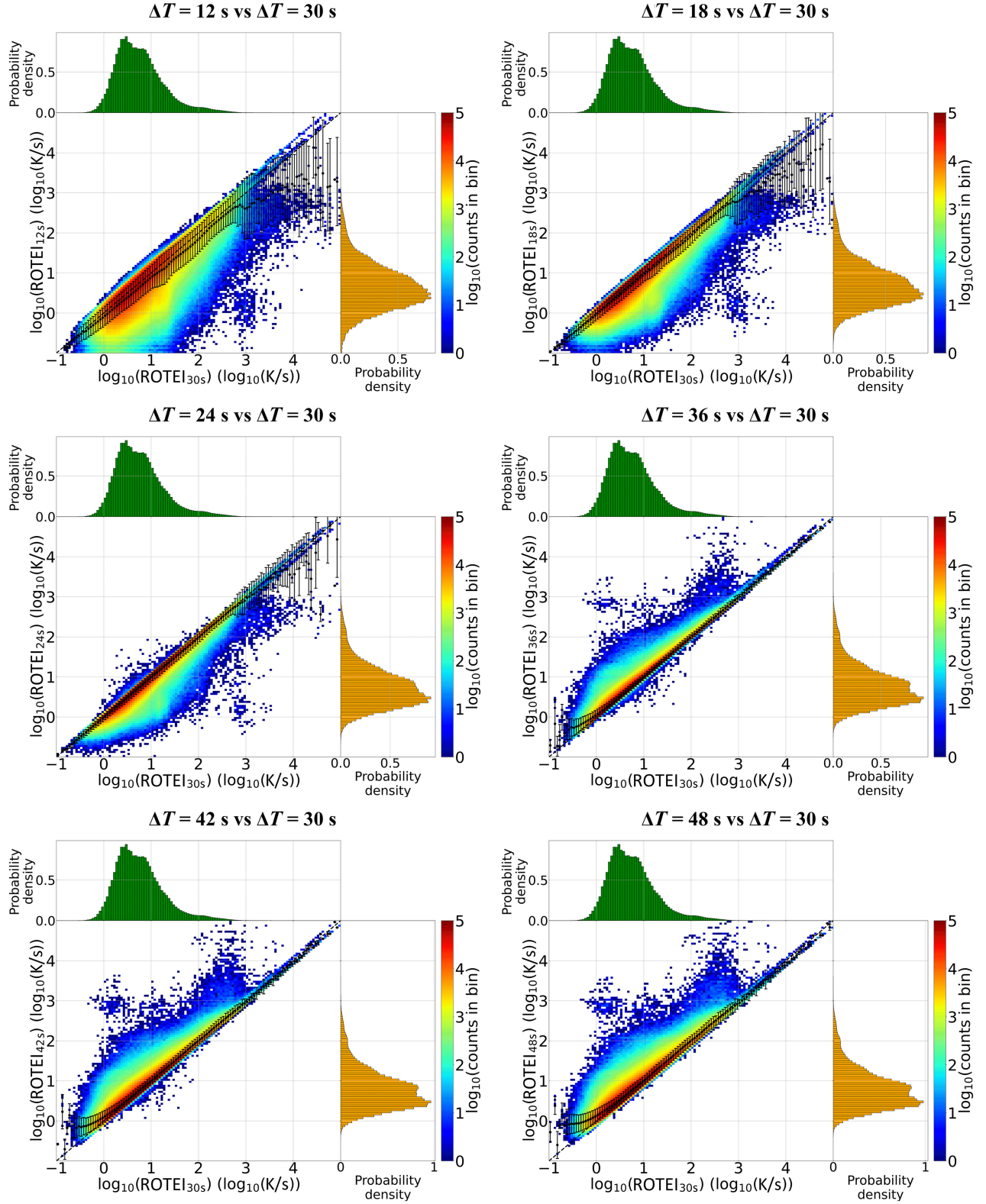


Fig. 9. Joint probability distribution of ROTEI values calculated with the sampling time fixed to $\Delta t = 3$ s. In each of the six panels, the ROTEI dataset calculated with $\Delta T = 30$ s (ROTEI_{30s}) is reported on the x-axis, whereas ROTEI datasets for different ΔT values are reported on the y-axis. CSES-01 LAP data are those recorded from January 1, 2019 to August 31, 2021, for the daytime sector.

Comparison between ROTEI calculated with windows of different length

CSES data from 01/01/2019 to 31/08/2021, FLAG = 1 & 2, $\Delta t = 3$ s, Daytime sector ~ 14 LT

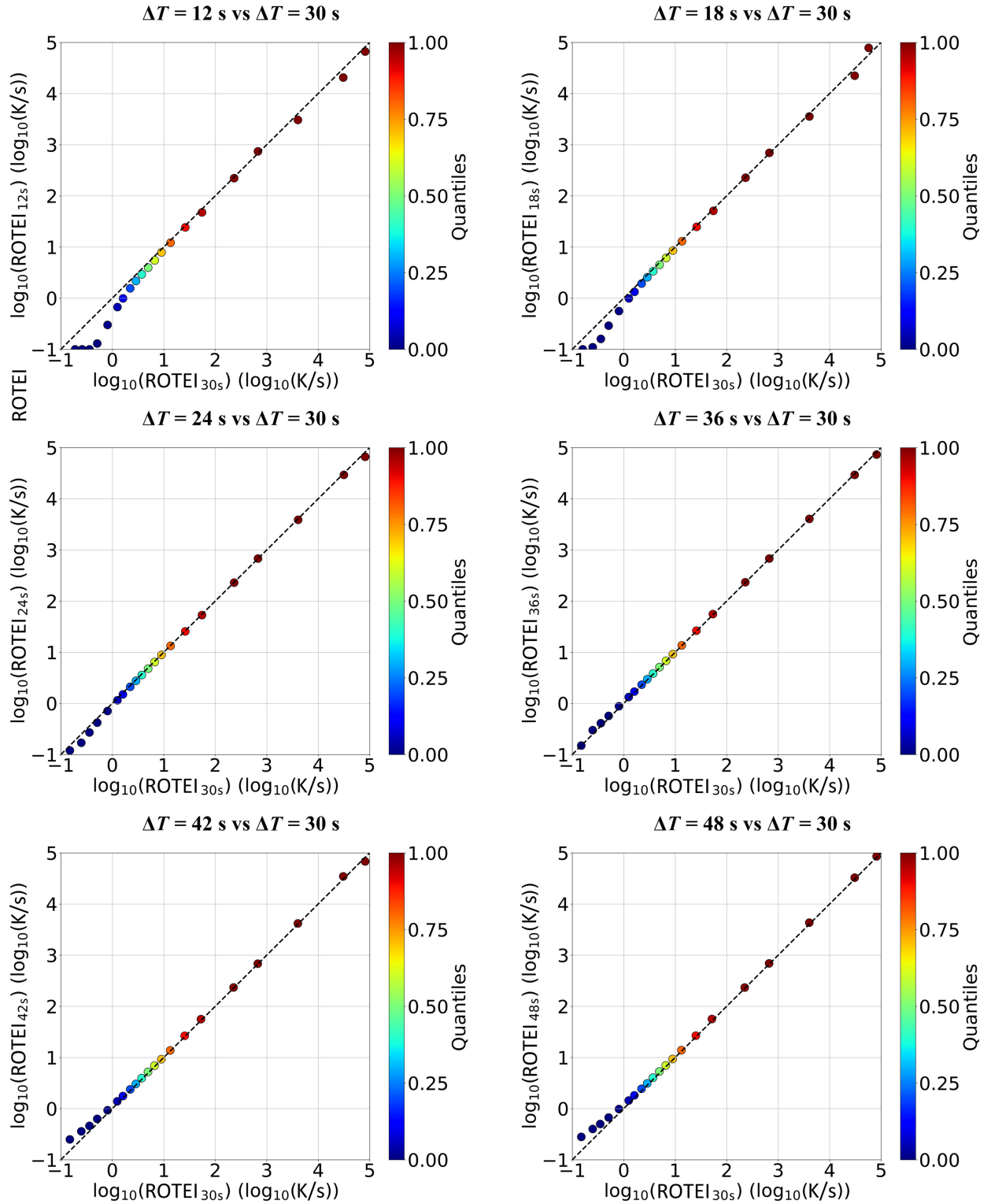


Fig. 10. Q-Q plots of ROTEI values calculated with the sampling time fixed to $\Delta t = 3$ s. In each of the six panels, the ROTEI dataset calculated with $\Delta T = 30$ s (ROTEI_{30s}) is reported on the x-axis, whereas ROTEI datasets for different ΔT values are reported on the y-axis. CSES-01 LAP data are those recorded from January 1, 2019 to August 31, 2021, for the daytime sector.

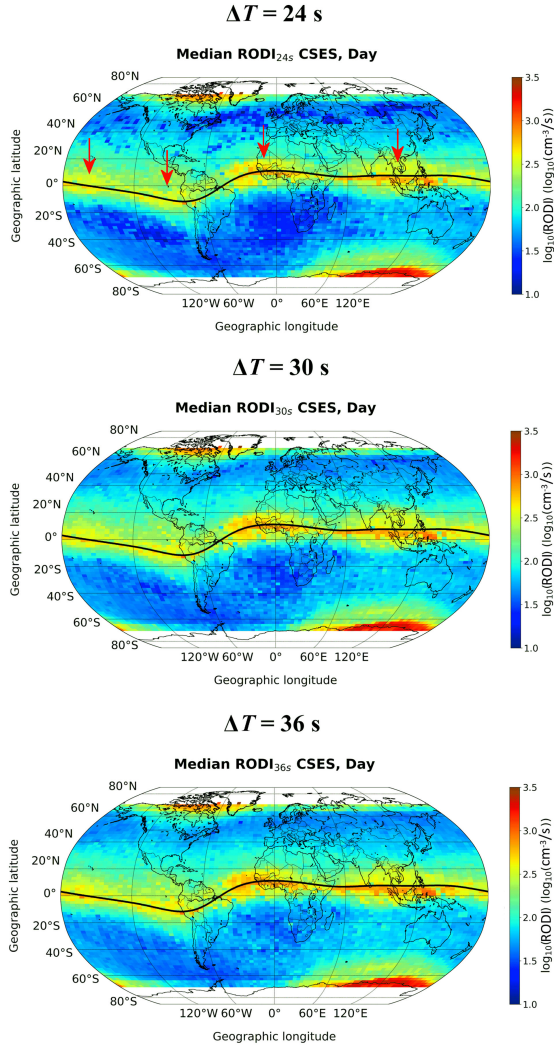


Fig. 11. Median RODI calculated from January 1, 2019 to August 31, 2021 for the daytime sector (~ 14 LT) with $\Delta t = 3$ s, for $\Delta T = 24$ s (top panel), $\Delta T = 30$ s (middle panel), and $\Delta T = 36$ s (bottom panel), plotted in geographic coordinates. Bins are 2° wide in latitude and 4° wide in longitude. In the top panel, four red arrows highlight the position of four maxima that are well visible also in the middle and bottom panels. The black curve in all the panels represents the geomagnetic equator. The figure for the nighttime sector can be found in the Supplementary Material.

about 7.5–8.0 km/s, and then data are taken in different spatial regions. Consequently, the time and spatial scales are tied by the satellite velocity, and to study the local small-scale properties of both N_e and T_e , we would need a window as short as possible. At the same time, however, the choice of the window width is affected by both the measurement sampling time and the need of having enough data in the window, in order to obtain an index statistically significant.

Finally, we need to find a reasonable compromise according to both the data sampling time and the satellite orbital velocity. This is why we think that the best choice is to set ΔT to 24 s. This choice is supported also by what is shown in Fig. 11, which is an example of median daytime RODI values, for $\Delta t = 3$ s and $\Delta T \in [24, 36]$ s. The three maps show similar large-scale patterns. For instance, at low latitudes, four maxima can be observed

in the longitudinal variation of electron density. These features were first discovered by Immel *et al.* [27] in IMAGE/EUV observations, then confirmed by Lühr *et al.* [28] with CHAMP data, and by Scherliess *et al.* [29] with TOPEX data. Moreover, part of the auroral boundaries in both hemispheres can be seen, in agreement with recent works by Jin *et al.* [7] and Pezzopane *et al.* [19]. Although the choice of the window width in the range [24, 36] s seems not to dramatically affect the climatological maps of RODI, the shortest window is the most indicated to highlight small-scale patterns, which emerge by looking at individual orbits. With this choice, the maximum number of data points included in the sliding window will be 9 in the survey mode ($\Delta t = 3$ s) and 17 in the burst mode ($\Delta t = 1.5$ s). Considering the satellite orbital velocity with $\Delta T = 24$ s, we are considering data collected in a 180–192 km wide region.

V. SUMMARY AND CONCLUSION

The main goal of the CSES mission is to look for ionospheric perturbations possibly associated with earthquakes. To this end, the calculation of indices, such as RODI and ROTEI, could be valid help. In this article, we have investigated the effects of different sampling times and different sliding window widths when calculating RODI and ROTEI based on N_e and T_e measurements made by LAP onboard CSES-01 satellite. Considering that these two indices are essential to describe the ionospheric irregularities and dynamics, it is easy to understand the importance of the choice of these two parameters. To accomplish this task, we have considered N_e and T_e measurements recorded between January 1, 2019 to August 31, 2021 in both survey (sampling time of 3 s) and burst (sampling time of 1.5 s) modes. The main outcomes of the study can be summarized as follows.

- 1) It is not possible to merge values of RODI or ROTEI calculated with different sampling times because their magnitude is sensibly different; the shorter the data sampling time, the higher the calculated indices. By taking into account that CSES-01 LAP data are recorded in the burst mode ($\Delta t = 1.5$ s) only for a limited portion of the Earth's surface, we suggest calculating RODI and ROTEI considering a sampling time of 3 s. In this way, the whole CSES dataset can be used;
- 2) The wider the sliding window used to calculate the indices, the higher the indices. Anyhow, to study the small-scale properties of both N_e and T_e , the window cannot be too wide, but at the same time, it must contain a number of points, such as to obtain a statistically significant index. According to the analyses shown in this article, we suggest setting the width of the sliding window to 24 s.

The results of this study represent the first fundamental step toward the implementation of a standard procedure to calculate RODI and ROTEI from CSES-01 satellite LAP data. In order to characterize the small-scale irregularities of the topside ionosphere, which is crucial for space weather purposes, it is the intention of the authors to explore in the near future the main spatial, seasonal, and solar activity variations exhibited by these indices, calculated through the procedure outlined in this work, and compare them with those based on Swarm data.

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¹[Online]. Available: <http://cses.roma2.infn.it>

²[Online]. Available: <https://www.leos.ac.cn/>



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