Validation of NeQuick topside ionospheric formulation using selected COSMIC/FORMOSAT-3 data and possible improvements

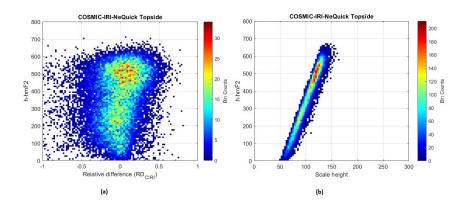
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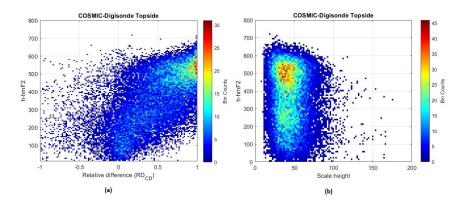
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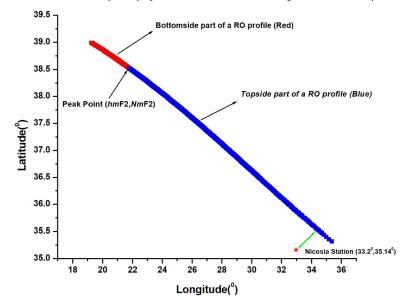
Abstract

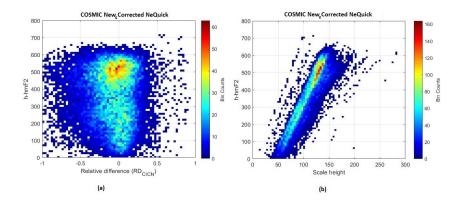
We examine systematic differences between topside electron density measurements and different topside model formulations including ground-based α -Chapman extrapolated topside electron density profiles from auto scaled ionograms, International Reference Ionosphere Model (IRI-2016) NeQuick topside estimations and a recently improved NeQuick (Corrected NeQuick) topside formulation. The selected topside electron density measurements considered were taken, from radio occultation electron density profiles on board low Earth orbit (LEO) satellites from the COSMIC/FORMOSAT-3 mission, in the vicinity of digisonde stations on a global scale. A subset of these radio occultation profiles, with matched (within 5%) peak NmF2 and hmF2 characteristics is also exploited to focus the comparison to a high quality validation dataset. The comparison shows that α -Chapman and Corrected NeQuick underestimate, whereas IRI-NeQuick overestimates COSMIC topside electron density observations. The key parameter g which controls the change of scale height w.r.t. altitude near the F region peak is optimised to a value of 0.15 (compared to a currently adopted value of 0.125). The Corrected NeQuick topside formulation using the optimised g value of 0.15 (represented as New_g) outperforms all other topside formulations.

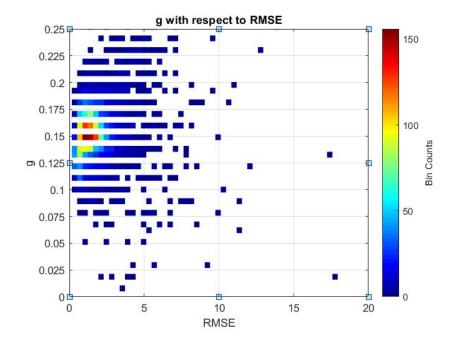




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1 2	Validation of NeQuick topside ionospheric formulation using selected COSMIC/FORMOSAT-3 data and possible improvements
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9 10	Corresponding author Email: arsurya123@gmail.com
11	Key Points:
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13 14	• α-Chapman and Corrected NeQuick underestimate, whereas IRI-NeQuick overestimates COSMIC topside electron density measurements.
15	 Corrected NeQuick provides a better topside representation among all three topside
16	formulations.
17	• Corrected NeQuick topside formulation further improves with an optimised value of g
18	= 0.15.
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36 Abstract

We examine systematic differences between topside electron density measurements and 37 different topside model formulations including ground-based a-Chapman extrapolated 38 topside electron density profiles from auto scaled ionograms, International Reference 39 Ionosphere Model (IRI-2016) NeQuick topside estimations and a recently improved NeQuick 40 (Corrected NeQuick) topside formulation. The selected topside electron density 41 measurements considered were taken, from radio occultation electron density profiles on 42 board low Earth orbit (LEO) satellites from the COSMIC/FORMOSAT-3 mission, in the 43 vicinity of digisonde stations on a global scale. A subset of these radio occultation profiles, 44 with matched (within 5%) peak NmF2 and hmF2 characteristics is also exploited to focus the 45 46 comparison to a high quality validation dataset. The comparison shows that α -Chapman and Corrected NeQuick underestimate, whereas IRI-NeQuick overestimates COSMIC topside 47 electron density observations. The key parameter g which controls the change of scale height 48 w.r.t. altitude near the F region peak is optimised to a value of 0.15 (compared to a currently 49 adopted value of 0.125). The Corrected NeQuick topside formulation using the optimised g 50 value of 0.15 (represented as New_g) outperforms all other topside formulations. 51

52 **1. Introduction**

The COSMIC/FORMOSAT-3 (Constellation Observing System for Meteorology, 53 Ionosphere, and Climate and Formosa Satellite) mission has been very successful in 54 facilitating the vertical profiling of the atmosphere and the study of the topside ionosphere 55 56 (Anthes R.A. et al., 2008). The radio occultation (RO) technique is based on precise dualfrequency phase measurements (Schreiner et al., 1999) from GNSS receivers on board Low-57 58 Earth Orbit (LEO) satellites that exploit radio signals transmitted from global navigation satellite system (GNSS) satellites. Many authors have worked on the validation of COSMIC 59 60 data using co-located digisonde and Incoherent Scatter Radar (ISR) stations (Stankov and Jakowski, 2006; Lei et al., 2007; Krankowski et al., 2011; Yue et al., 2011; Cherniak and 61 62 Zakharenkova, 2014; Hu et al., 2014; McNamara and Thompson, 2015; Panda et al., 2018; Shaikh et al., 2018; Wang et al., 2019; Bai et al., 2019). 63

The topside part of the ionosphere is defined as the region between the maximum electron density of the F2 layer to the upper transition height (Rishbeth and Garriott, 1969). The transition of heavy O^+ ions to lighter H^+ ions leads to a smooth decrease in the electron

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density. This smooth decrease is expressed by a parameter called scale height (Hargreaves, 1992). To determine the scale height, the information of the mean ion mass, their chemical state and plasma temperature must be known but this information is not available on a global scale. So there are alternative methods to estimate the effective scale height based on electron density measurements (Liu et al., 2007a, 2007b) since to accurately model the topside ionosphere, the effective scale height is a major requirement.

The International Ionosphere Model (IRI) -2016 (Bilitiza et al., 2017) offers three options to 73 model the electron density in the topside ionosphere, IRI-2001 (Bilitiza, 1990), IRI01-corr 74 (Bilitiza, 2004) and the most reliable NeQuick (Radicella and Leitinger, 2001; Coisson et al., 75 2006; Nava et al., 2008) but according to past and recent studies there is still room for 76 improvement (Bilitiza et al., 2006, Bilitiza, 2009; Pignalberi et al., 2016). The NeQuick 77 78 topside model uses an Epstein function (as shown in equation 1) to model the topside ionosphere. The electron density profile (Ne (h)) is constructed as a function of *hm*F2, *Nm*F2 79 80 and effective scale height (Hm).

81 Ne (h) = 4.NmF2.
$$\frac{exp\left(\frac{h-hmF2}{Hm}\right)}{\left(1+exp\left(\frac{h-hmF2}{Hm}\right)\right)^2}$$
 (1)

82

89

$$Hm = H_0 \left[1 + \frac{r \cdot g(h - hmF2)}{r \cdot H_0 + g \cdot (h - hmF2)} \right]$$
(2)

The scale height in the NeQuick topside formulation is described by three parameters, scale height at the peak (H₀), parameter r which restricts the scale height at higher altitudes and the altitude gradient of the scale height (g). A value of r = 100 and g = 0.125 is adopted in NeQuick topside formulation, while H₀ is estimated from equation (3), where *fo*F2 is the peak critical frequency, *Nm*F2 is the peak electron density, *hm*F2 is the height corresponding to *Nm*F2 and R12 is the 12 month smoothed sunspot number.

$$H_0 = k.B2_{Bot}$$
(3)

90
$$k = 3.22 - 0.0538 * f_0F_2 - 0.00664 * hmF_2 + 0.113 * \frac{hmF_2}{B_{2Bot}} + 0.00257 * R_{12}$$
 (4)

An improvement in the NeQuick topside formulation (NeQuick-corr [Pezzopane and Pignalberi, 2019]) has been recently proposed. This Corrected NeQuick topside formulation is based on H_0 grids, as a function of *hm*F2 and *Nm*F2, generated by applying the IRI-UP (Update) method (Pignalberi et al., 2018) and also by exploiting electron density values measured by the Langmuir probes on-board Swarm satellites. According to this method, H_0 is 96 estimated as $H_{0, AC}$ and $H_{0, B}$ at two different altitudes for each pair of *hm*F2 and *Nm*F2 values 97 to determine a new H_0 formulation in accordance to equations (45) and (6).

98
$$H_0 = H_{0, AC} + (H_{0, B} - H_{0, AC}) \cdot \frac{h - hmF2}{600}$$
 for $hmF2 \le h \le hmF2 + 600$ (5)

99
$$H_0 = H_{0,B}$$
 for $h \ge hmF2+600$ (6)

where two 2-D grids provide the values of $H_{0, AC}$ and $H_{0, B}$ as a function of *fo*F2 and *hm*F2.

Themens et al., 2018 demonstrated that the IRI-NeQuick option can be improved over upper 101 mid latitude and high latitude regions by adjusting r and g values to r = 20 and g = 0.2024. 102 Another study by Themens et al., 2014 showed that IRI-NeQuick parameterization does not 103 104 adequately represent the topside thickness during solar minimum between cycles 23 and 24 and Pignalberi et al., 2020 underlined the significance of r and g in the topside scale height 105 variation near the F2-layer peak (up to about 800 km). They have shown that the topside 106 scale height exhibits a linear dependence on the peak-relative altitude (h-hmF2), where g is 107 the slope and H_0 is the intercept, as follows: 108

109

$$H(h) \cong H_0 + g \times (h - hmF2)$$
(7)

110 In view of the above, in this paper, topside electron density values retrieved from 29063 COSMIC RO profiles in the vicinity of 44 digisonde stations are compared with α -Chapman, 111 112 IRI-NeQuick, and Corrected-NeQuick topside model electron density estimates. Furthermore, we show that a new g value of 0.15 produces better results using Corrected-NeQuick. To 113 114 validate this new g value in the Corrected-NeQuick topside formulation, scale height has been deduced from each COSMIC RO based on the valid assumption (up to 800 km) of a 115 linear dependence with altitude. This could be significant, in the context of the single-116 frequency GNSS correction algorithm (NeQuick-G) adopted by European Space Agency 117 (ESA) Galileo GNSS system, as r=100 and g=0.125 are the values embedded in the existing 118 version of NeQuick-G. 119

120 **2. Data**

The comparison between topside COSMIC RO profiles (downloaded from the CDAAC data server <u>https://cdaac-www.cosmic.ucar.edu/cdaac/products.html</u>) and digisonde topside profiles was carried out under time and space coincidence requirements. In particular the COSMIC topside electron density value considered, was the one at a minimum distance to the digisonde location (as shown in Figure 1). Figure 1 shows the COSMIC RO profile with respect to latitude and longitude, where the red part of the profile shows the bottomside

projection and blue part shows the topside profile projection. It also shows the nearest 127 digisonde station (Nicosia station as an example) and the minimum (perpendicular) distance 128 between digisonde station and topside profile. We have also excluded any unrealistic RO 129 profiles with excessive fluctuations in the topside electron density and hmF2 outside the 130 range [150<hmF2<450] km. In total 29063 profiles in the interval 2006-2018 were 131 considered. The autoscaled digisonde data were downloaded from the Digital Ionogram Data 132 Base (DIDBase- http://giro.uml.edu/didbase/scaled.php). The selected digisonde stations, 133 their location (latitude, longitude) and the number of nearest selected COSMIC profiles are 134 135 shown in Table 1. To construct the digisonde topside electron density profile, hmF2, foF2 and scale height values were applied in α -Chapman function, shown in equation (8): 136

137 Ne (h) =
$$NmF2.exp\left\{\frac{1}{2}\left[1 - \frac{h - hmF2}{H}exp\left(-\frac{h - hmF2}{H}\right)\right]\right\}$$
 (8)

The corresponding IRI-NeQuick values were also estimated at the corresponding COSMIC 138 topside electron density altitude (at a minimum distance from the corresponding digisonde) 139 using the FORTRAN source code for IRI 2016, available at http://irimodel.org/ by ingesting 140 hmF2 and foF2 auto-scaled values. The Corrected-NeQuick values were estimated by 141 calculating H₀ using the H_{0.AC} and H_{0.B} grid (downloaded from the supplementary data of the 142 Pezzopane and Pignalberi, (2019)) for the same hmF2 and NmF2 values. This dataset is 143 termed as DATABSE 1. To compare COSMIC to α-Chapman (digisonde), IRI-NeQuick, 144 Corrected NeQuick and Newg Corrected NeQuick data, relative differences were calculated 145 146 as shown below:

147Relativedifference
$$(RD_{CD}) =$$
 $\frac{COSMIC \ electron \ density - digisonde \ electron \ density}{COSMIC \ electron \ density}$ 148(9)149Relativedifference $(RD_{CIRI}) =$ $\frac{COSMIC \ electron \ density - IRI - NeQuick \ model \ electron \ density}{COSMIC \ electron \ density}$ 150(10)151Relative \ difference (RD_{CCN}) = $\frac{COSMIC \ electron \ density - Corrected \ NeQuick \ model \ electron \ density}{COSMIC \ electron \ density}$ 152(11)153Relative \ difference (RD_{CICN}) =154 $\frac{COSMIC \ electron \ density - New_g Corrected \ NeQuick \ model \ electron \ density}{COSMIC \ electron \ density}$

155 (12)

156

coincidence at the peak values (NmF2, hmF2) of the profile within <5% difference in hmF2157 and NmF2 was satisfied, in an effort to ensure more reliable topside profiles in accordance to 158 findings in a previous study (Shaikh et al., 2018). We have found thirty four hundred thirty 159 three (3433) such cases out of 29,063 cases from DATASET 1, based on which, we have 160 calculated corresponding IRI-NeQuick, Corrected NeQuick and New_g Corrected profiles. 161 This dataset is termed as DATASET 2. 162 To compare the full topside profiles recorded by the COSMIC RO satellites and modeled by 163 164 α-Chapman (digisonde), IRI-NeQuick, Corrected NeQuick and Newg Corrected NeQuick a relative difference (as a function of altitude beyond the peak) was calculated as shown below: 165 Relative difference $(RD_{CD}(h)) = \frac{COSMIC \text{ electron density}(h) - \text{digisonde electron density}(h)}{L}$ 166 COSMIC electron density (h) (13)167 Relative difference $(RD_{CIRI}(h)) = \frac{COSMIC \text{ electron density }(h) - IRI - NeQuick model electron density}(h)$ 168 COSMIC electron density (h) (14)169 Relative difference $(RD_{CCN}(h)) = \frac{COSMIC \text{ electron density}(h) - Corrected NeQuick electron density}(h)$ 170 COSMIC electron density(h) (15)171 Relative difference $(RD_{CICN}(h)) =$ 172 COSMIC electron density (h)-NewgCorrected NeQuick model electron density (h) 173 COSMIC electron density (h) 174 (16)175 and. htop = h - hmF2(17)176 htop denotes the peak-relative altitude in km. 177 To investigate the overall performance in terms of the full profile in the various topside 178

The second dataset used in this investigation is based on a subset of DATASET 1 for which

179 formulations, a Normalised Root Mean Square Error (NRMSE) was calculated for each of the

180 3433 profiles for DATASET 2, using:

181
$$NRMSE = \sqrt{\frac{\sum_{i=1}^{N} \left(\frac{Ne_{measured,i}-Ne_{modeled,i}}{Ne_{measured,i}}\right)^2}{N}}$$
(18)

where subscript *measured* refers to COSMIC measurements, while *modeled* to either α -Chapman, IRI-NeQuick or Corrected NeQuick. *N* is the total number of electron density profile points.

The scale height (Hm) was calculated for COSMIC, α-Chapman, IRI-NeQuick and Corrected
NeQuick data from the Epstein equation as shown below. Pignalberi et al., (2020) also have
used same approach to calculate scale height from COSMIC profile.

188 N (h) = 4. NmF2.
$$\frac{exp\left(\frac{h-hmF2}{Hm}\right)}{\left(1+exp\left(\frac{h-hmF2}{Hm}\right)\right)^2}$$
(19)

$$\frac{N(h)}{4NmF2} = \frac{exp\left(\frac{h-hmF2}{Hm}\right)}{\left(1 + exp\left(\frac{h-hmF2}{Hm}\right)\right)^2}$$

189 Let,

190
$$Y = exp\left(\frac{h-hmF2}{Hm}\right)$$
(20)

191
$$X = \frac{N(h)}{4NmF2}$$
(21)

192 then the equation becomes:

193
$$X (1+Y)^2 = Y$$

194 $X Y^2 + (2X-1) Y + X=0$ (22)

By using the Sridhar Acharya formula, the solution for the above quadratic equation reducesto:

197
$$Y(1,2) = \frac{\left[(2NmF2 - N(h)) \pm 2\sqrt{NmF2^2 - N(h).NmF2}\right]}{N(h)}$$
(23)

and by solving equation (19) and (23), Hm would be:

199
$$Hm = \frac{h - hmF2}{\ln Y(1,2)}$$
(24)

200 The calculated scale height from equation 24 was used to check the linear fit dependence.

201 **3. Results:**

The comparison between topside electron density profile measurements and model formulations, as described in section 2 is presented in the following sections. The results in section (3.1) are based on DATASET 1 and section (3.2) and (3.3) are based on DATASET 2.

3.1 Comparison based on DATASET 1

207 Figure 2 (a) shows the binned scatter plot between peak-relative altitude (htop=h-hmF2) and relative difference (RD_{CD}) between COSMIC observations and α-Chapman estimations, 208 while the colour bar shows the counts in each bin. As it can be seen from the graph, in the 209 vast majority of cases RD_{CD} is greater than zero which indicates that α -Chapman 210 underestimates COSMIC observations and this difference increases with htop with the bin 211 occurrence maximising around 500 km (above hmF2). The findings from Figure 2 (a) are 212 justified because digison topside estimation is based on a α -Chapman function, with a 213 constant scale height (as shown in Figure 2 (b)), but real observations differ from α -Chapman 214 estimates because scale height increases linearly with height over the peak (Olivares-Pulido 215 et al., 2016). The scale height behaviour of COSMIC observations (as shown in Figure 5) was 216 calculated from DATASET 1 using equation 24. 217

218 Figure 3(a) shows the binned scatter plot between peak-relative altitude (htop) and relative difference (RD_{CIRI}) between COSMIC observations and IRI-NeQuick estimates. It shows that 219 IRI-NeQuick slightly overestimates the COSMIC observations up to an approximate htop 220 altitude of 300km and then its behaviour reverses underestimating COSMIC measurements. 221 IRI-NeQuick is based on an Epstein function to represent the topside profile with an 222 approximately linear scale height (calculated using equation 24, as shown in Figure 3 (b)) and 223 therefore its performance is superior to α -Chapman. The IRI-NeQuick considers values of 224 r=100 and g=0.125 for calculating the scale height. The error with respect to htop as shown in 225 Figure 3 (a) could be due to the difference in the change of scale height with w.r.t. htop (g) 226 227 between COSMIC observations and IRI-NeQuick estimations (Themens et al., 2018).

Figure 4 (a) shows the binned scatter plot between peak-relative altitude (htop) and relative difference (RD_{CCN}) between COSMIC observations and Corrected NeQuick estimates. It shows that Corrected NeQuick underestimates COSMIC observations and this underestimation increases with htop. The Corrected NeQuick is equivalent to IRI-NeQuick but the value of H₀ is deduced from H_{0,AC} and H_{0,B} grids and the scale height (as shown in Figure 4 (b)) is calculated by equation 24 following equations 5 and 6 as proposed by Pezzopane and Pignalberi, (2019). As it is clear from Figure 3 (a) and Figure 4 (a), for the majority of cases IRI-NeQuick exhibits an approximate error in the range -0.2 to 0.4 and for Corrected NeQuick the error lies in the range of 0 to 0.35 respectively, which demonstrates that Corrected NeQuick outperforms IRI-NeQuick.

The above results clearly indicate that the scale height calculated using different H_0 238 formulations is not able to match the scale height calculated from COSMIC observations and 239 that further potential improvement could be achieved by more appropriate values for r and g 240 (Themens et al., 2018). To explore this possibility, we used least squares to optimize the 241 value of g and r keeping H₀ constant for Corrected NeQuick. The value of r varied with a step 242 size of 1 and g with a step size of 0.01. As the COSMIC data were mostly limited to an 243 244 altitude below 800 km, since r controls the scale height at higher altitudes, r did not change at all during this optimization (r=100). Pignalberi et al., (2020) also showed that the effect of 245 246 varying r on the scale height, is seen on the altitude much higher from the F2 peak. Figure 6 shows the variation of r and g with respect to the RMSE calculated between COSMIC 247 observations and Corrected-NeQuick estimates. COSMIC and Corrected NeQuick 248 comparison showed that for r = 100 and an optimised value of g = 0.15, RMSE minimizes. In 249 this method, to estimate the electron density, the Epstein equation was used and scale height 250 was calculated using H₀ extracted from the H_{0.AC} and H_{0.B} grid r = 100 and g = 0.15. Figure 7 251 (a) shows the binned scatter plot between peak-relative altitude and relative difference 252 (RD_{CICN}) between COSMIC observations and New_g Corrected NeQuick estimates. It shows 253 that the RD (CICN) is almost constant with htop and it is confined within a bounded region. So 254 by comparing all four methods (Figure 2, 3, 4&7) it can be stated that the performance of 255 New_g Corrected NeQuick method is better than the other four methods for this particular 256 257 dataset. The scale height (calculated from equation 24 for New_g Corrected NeQuick method is shown in Figure 7 (b). 258

259 **3.2 Comparison based on DATASET 2**

260 DATASET 2 is a subset of DATASET 1 comprising of 3433 matched peak profiles (within 261 <5% difference in *hm*F2 and *Nm*F2). Figure 8 (a) and (b) show the binned scatter plot 262 between peak-relative altitude (htop=h-*hm*F2) and relative difference (RD_{CD} (h)) between 263 COSMIC and α -Chapman profiles, for h-*hm*F2>100 and h-*hm*F2<100 respectively. The 264 colour bar represents the counts in each bin. As discussed in section (3.1), α -Chapman 265 underestimates COSMIC observations and it increases with htop, which can also be observed 266 from Figure 8(a) as RD_{CD} (h) increases with htop. Figure 8 (b) shows that up to 100 km over 267 *hm*F2, the average RD_{CD} (h) fluctuates around zero. This is expected as α -Chapman scale 268 height is constant, around the peak.

Figure 9 (a) and (b) show scatter plots between peak-relative altitude (htop) and relative 269 difference (RD_{CIRI} (h)) between COSMIC profile and IRI-NeQuick estimated profile, for h-270 hmF2>100 and h-hmF2<100 respectively. Figure 9 (a) shows that IRI-NeQuick overestimates 271 272 (-0.5 to 0 for the majority of profiles) COSMIC up to approximately http=300km and then its behaviour reverses with a definite underestimation (within 0 to 0.2 for most profiles). The 273 results are similar with the findings discussed in section (3.1) indicating that IRI-NeQuick 274 275 clearly outperforms α -Chapman. Figure 9 (b) shows that up to htop =100km, the average 276 RD_{CIRI} (h) fluctuates around 0, which suggests that IRI-NeQuick also exhibits approximately constant scale height around the peak. 277

Figure 10 (a) and (b) shows the binned scatter plot between peak-relative altitude (htop) and 278 relative difference (RD_{CCN} (h)) between COSMIC and Corrected NeQuick, for h-hmF2>100 279 km and h-hmF2<100 km respectively. Figure 10 (a) shows that Corrected NeQuick 280 underestimates COSMIC and RD_{CCN} (h) increases (0 to 0.5) with http. Unlike IRI-NeQuick, 281 the behaviour of Corrected NeQuick does not reverse with htop, whereas the RD_{CCN} (h) gets 282 saturated for htop >300km. Figure 10 (b) shows that up to htop =100km average RD_{CCN} (h) 283 fluctuates around zero suggesting that like α-Chapman and IRI-NeQuick, Corrected NeQuick 284 also exhibits nearly constant scale height around the peak. 285

NRMSE between COSMIC and the three topside formulations was also calculated. Figure 11 286 287 (a) shows the scatter plot between the NRMSE values for Corrected NeQuick (w.r.t. COSMIC) on x axis and NRMSE values for α-Chapman (w.r.t. COSMIC) on y axis. For the 288 289 majority of cases NRMSE-α-Chapman exceeds NRMSE-Corrected NeQuick, which means 290 Corrected NeQuick performs better than α -Chapman. Figure 11 (b) shows the scatter plot 291 between NRMSE-Corrected NeQuick (w.r.t. COSMIC) on x axis and NRMSE-IRI-NeQuick (w.r.t. COSMIC) on y axis for each individual matched peak profile. It shows that NRMSE-292 293 Corrected NeQuick is lower for nearly half the cases (1803 out of 3433) and NRMSE-IRI-NeQuick is lower for the rest (1640 out of 3433) but for the majority NRMSE-Corrected 294 NeQuick is more bounded (from 0 to 0.5) whereas NRMSE-IRI-NeQuick extends from 0 up 295 296 to 0.8. Therefore, we can conclude that Corrected-NeQuick is superior to IRI-NeQuick for representing the topside, based on the particular COSMIC dataset under consideration. Klipp et al., (2020) recently applied the Corrected NeQuick method to study the comparison between the ionospheric total electron content from ionosondes and the International GNSS service vertical total electron content and reported that the error was reduced by 27 %.

The values of r = 100 and optimised value of g = 0.15 for Corrected NeQuick on DATASET 301 1 in section (3.1) were also tested for DATASET 2. Figure 12 (a) and (b) show the binned 302 scatter plot between peak-relative altitude (htop) and relative difference (RD_{CICN} (h)) between 303 COSMIC and Corrected NeQuick, for h-hmF2>100 and for h-hmF2<100. Figure 12 (a) 304 clearly shows that the RD_{CICN} (h) is almost constant with respect to htop and that it is 305 confined within a region (-0.2 to 0.2). RD_{CICN} (h) is also almost 0 for h-hmF2<100, as shown 306 in Figure 12 (b). By comparing Figure 8, 9, 10 and 12, it is clear that Corrected-NeQuick with 307 308 a value of g=0.15 outperforms all other topside formulations for DATASET 2 as well.

309 3.3 Topside scale height linear variation and validation of optimised value of g = 0.15 310 using DATASET 2.

As discussed in section (3.1) and (3.2), the behaviour of the topside scale height is expected 311 to be linear. So to verify this for all matched peak COSMIC profiles (3433 profiles in 312 DATASET 2), the scale height was calculated using equation 24. The scale height of each 313 profile was fitted under a linear approximation as shown in Figure 13 (a) and subsequently 314 the corresponding electron density profiles were calculated. Figure 13 (b) shows the relative 315 316 difference between measured and modeled electron density (using linearly fitted scale 317 height). Figure 13 (b) clearly shows that most of the error lies within 5%. This verifies the linear scale height variation up to 500 km over hmF2 (Pignalberi et al., 2020). The value of g 318 319 was also calculated for each of the linear fitted scale height matched peak COSMIC profiles using equation 7. The results are in line with those obtained by Pignalberi et al., (2020). 320

Figure 14 shows the variation of g (calculated from equation 7) with respect to RMSE between COSMIC and linearly fitted scale-height electron density profiles from DATASET 2. It shows that for the majority of the profiles, a value of g = 0.15 (±0.015) minimises RMSE. As it was discussed in section (3.1) and (3.2), for an optimum value of g = 0.15, Relative difference between COSMIC and Corrected NeQuick minimises and exhibits the best performance among all four topside formulations tested on both DATASET 1 and 2.

327

328 **4.** Conclusion:

A comparison study between COSMIC topside electron density observations and αChapman, IRI-NeQuick and Corrected NeQuick estimations has resulted in the following
conclusions:

- The overall performance of Corrected NeQuick is superior to IRI-NeQuick, as the
 NRMSE introduced by the former is confined (from 0 to 0.5) than the latter (from 0 to
 0.8) for the vast majority of cases.
- 2) For an optimum value of g = 0.15, New_g Corrected NeQuick performance improves further. This could be significant, in the context of the single-frequency GNSS correction algorithm (NeQuick-G) adopted by European Space Agency (ESA) Galileo GNSS system, as r=100 and g=0.125 are the values embedded in the existing version of NeQuick-G.
- 340 3) Electron density profiles derived from a linear fitted scale height as extracted from
 341 COSMIC electron density profiles lie within 5% relative difference.
- 342 4) The best linear fit scale height shows that for the optimised value of g = 0.15, RMSE 343 is lowest between COSMIC and linearly fitted scale-height electron density profiles

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488 **Table captions:**

Table 1: The Ionosonde stations name (Country) collocated with the COSMIC RO profiles
with their location (geographic latitude, longitude), geomagnetic latitude, Number of
coincident observations and Number of Matched Peak Profiles.

492 **Figure Caption:**

Figure 1: The graph shows the COSMIC RO profile variation with respect to Latitude (on y axis) and Longitude (on x-axis) and Nearest Digisonde station which meets the topside coincident criteria.

496 **Figure 2:**The graph shows the binscatter plot of (a) Relative difference (RD_{CD}) between 497 COSMIC observations and α-Chapman estimations (b) Scale height of α-Chapman 498 estimations as a function of peak-relative altitude (h-*hm*F2).

Figure 3: The graph shows the binscatter plot of (a) Relative difference (RD_{CIRI}) between COSMIC observations and IRI-NeQuick estimations (b) Scale height of IRI-NeQuick estimations as a function of peak-relative altitude (h-*hm*F2).

Figure 4: The graph shows the binscatter plot of (a) Relative difference (RD_{CCN}) between COSMIC observations and Corrected NeQuick estimations (b) Scale height of Corrected NeQuick estimations as a function of peak-relative altitude (h-*hm*F2).

Figure 5: The graph shows the binscatter plot of Scale height of COSMIC observations as a
function of peak-Relative altitude (h-*hm*F2).

Figure 6: The graph shows the contour plot of RMSE between COSMIC observations andCorrected NeQuick estimations for varying value of r and g.

Figure 7: The graph shows the binscatter plot of (a) Relative difference (RD_{CICN}) between COSMIC observations and New_g Corrected estimations (b) Scale height of New_g Corrected estimations as a function of peak-relative altitude (h-*hm*F2).

512 Figure 8: The graph shows the binscatter plot of relative difference $(RD_{CD} (h))$ between

513 COSMIC observed and α -Chapman estimated matched peak electron density profiles for (a)

- 514 h-hmF2>100 (b) h-hmF2<100 as a function of peak-relative altitude (h-hmF2).
- 515 Figure 9: The graph shows the binscatter plot of relative difference (RD_{CIRI} (h)) between

516 COSMIC observed and IRI-NeQuick estimated matched peak electron density profiles for (a)

517 h-hmF2>100 (b) h-hmF2<100 as a function of peak-relative altitude (h-hmF2).

- **Figure 10:** The graph shows the binscatter plot of relative difference (RD_{CCN} (h)) between
- 519 COSMIC observed and Corrected NeQuick estimated matched peak electron density profiles
- 520 for (a) h-hmF2>100 (b) h-hmF2<100 as a function of peak-relative altitude (h-hmF2).
- 521 Figure 11: The graph shows the scatter plot between the NRMSE_Corrected NeQuick (a)
- 522 NRMSE_ α -Chapman (b) NRMSE_IRI-NeQuick for matched peak profiles. The Red line
- 523 shows the y=x line on the graph.
- 524 Figure 12: The graph shows the binscatter plot of relative difference (RD_{CICN} (h)) between
- 525 COSMIC observed and New_g Corrected NeQuick estimated matched peak electron density
- 526 profiles for (a) h-hmF2>100 (b) h-hmF2<100 as a function of peak-relative altitude (h-hmF2).
- Figure 13: The graph shows the (a) variation of Scale height inverted from COSMIC profile
 (blue dots) and red line shows the best linear fit line (b) Relative difference between the
 COSMIC matched peak profiles and corresponding linear fitted profiles as a function of
- 530 peak-relative altitude (h-*hm*F2).
- Figure 14: The graph shows the RMSE between the COSMIC matched peak profiles andcorresponding linear fitted profiles with respect to the slope of best linear fit line (g).

Figure 1.

COSMIC RO profile projection coincident with nearest digisonde station at topside

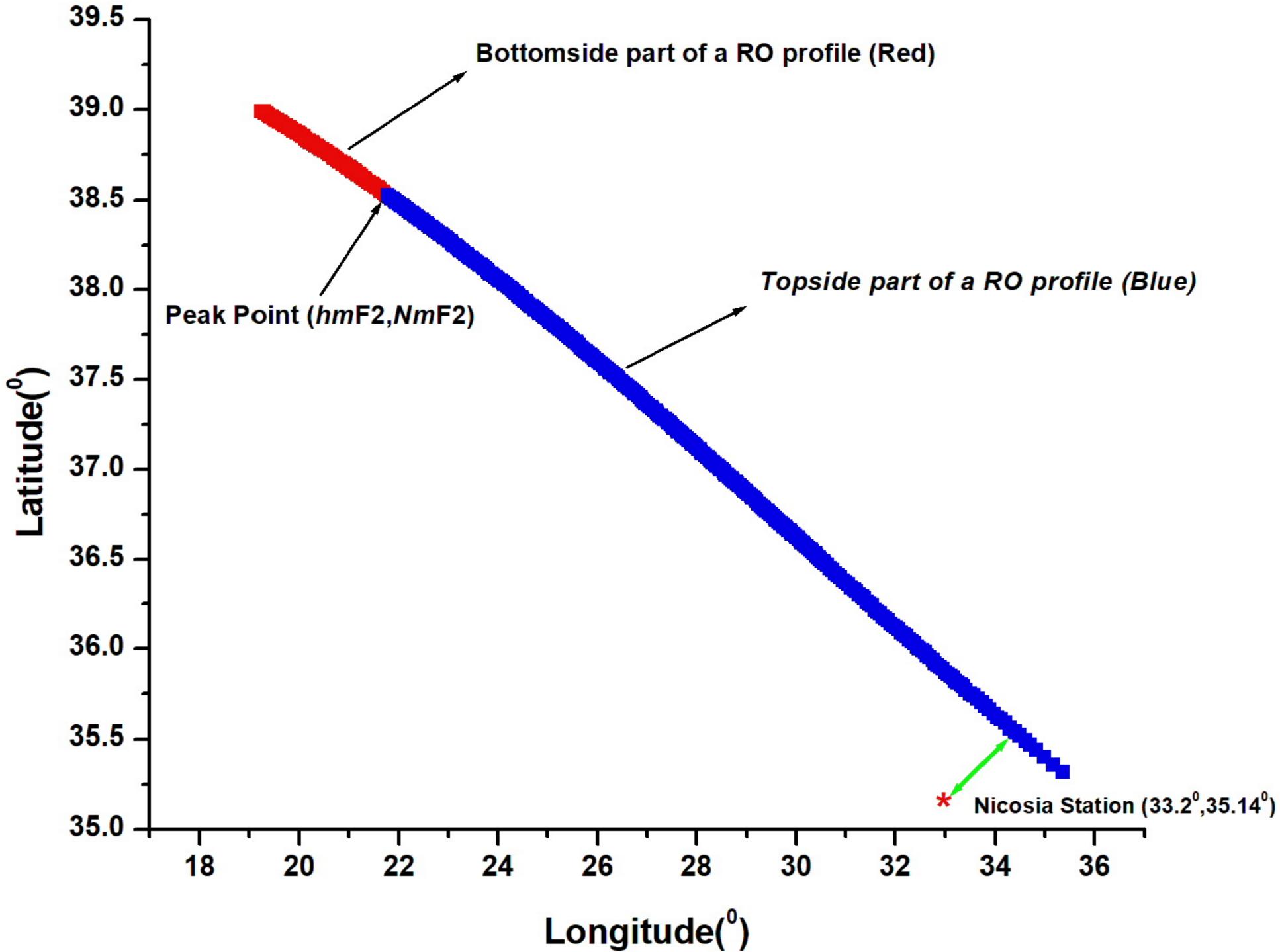


Figure 2.

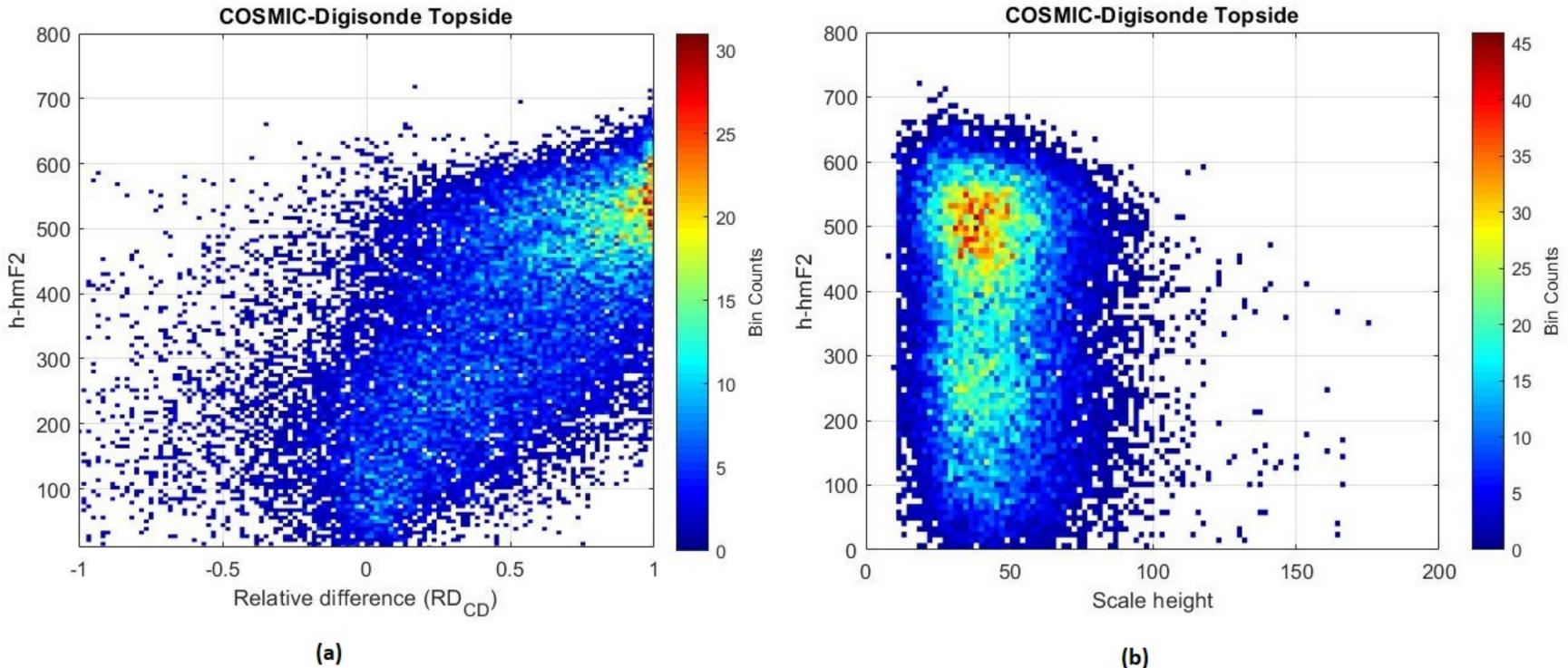
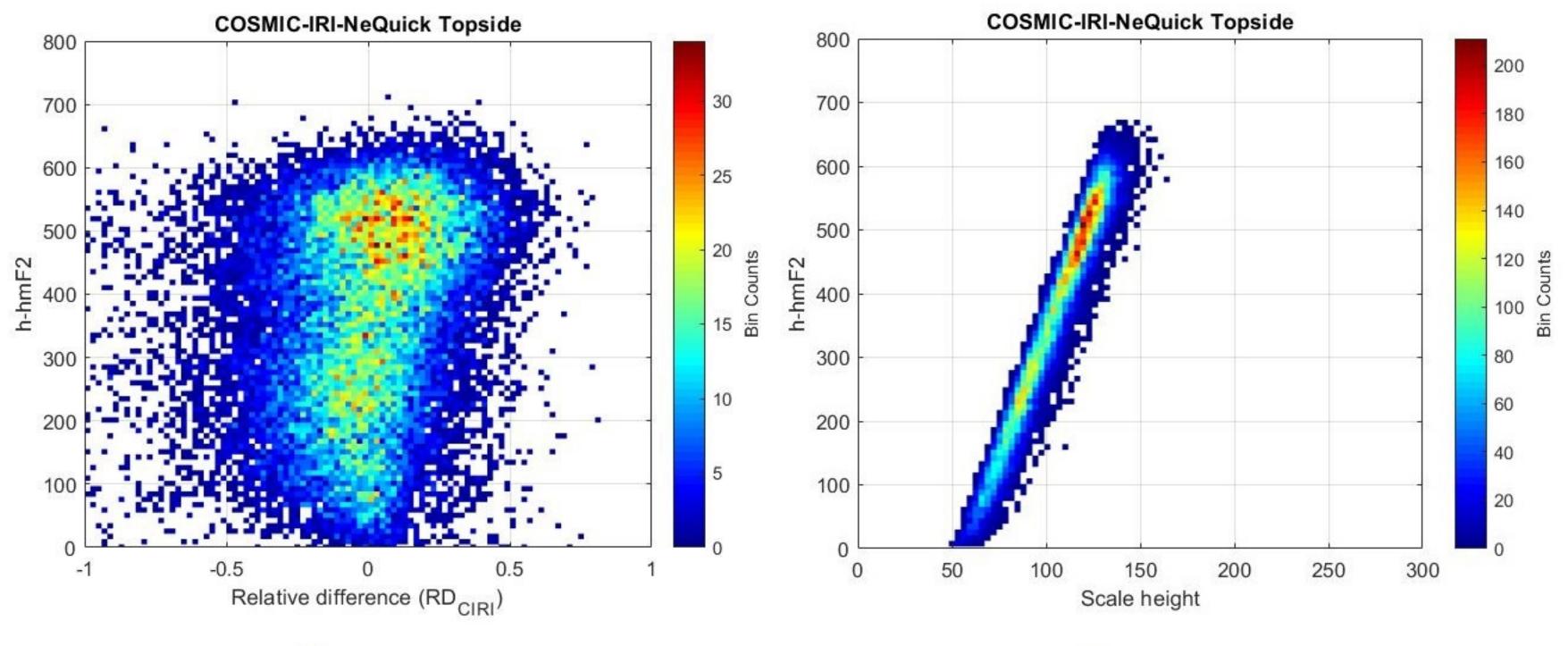


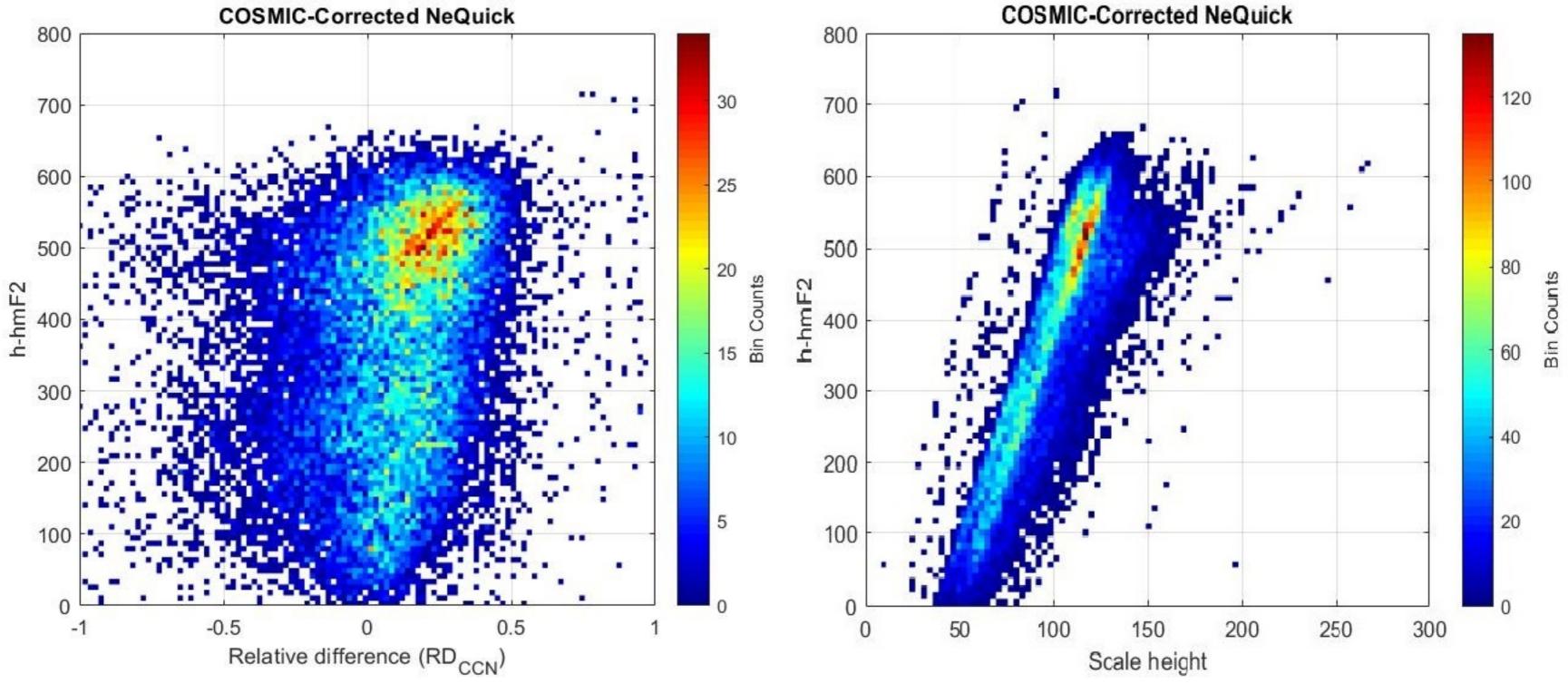
Figure 3.



⁽a)

(b)

Figure 4.



(a)

(b)

Figure 5.

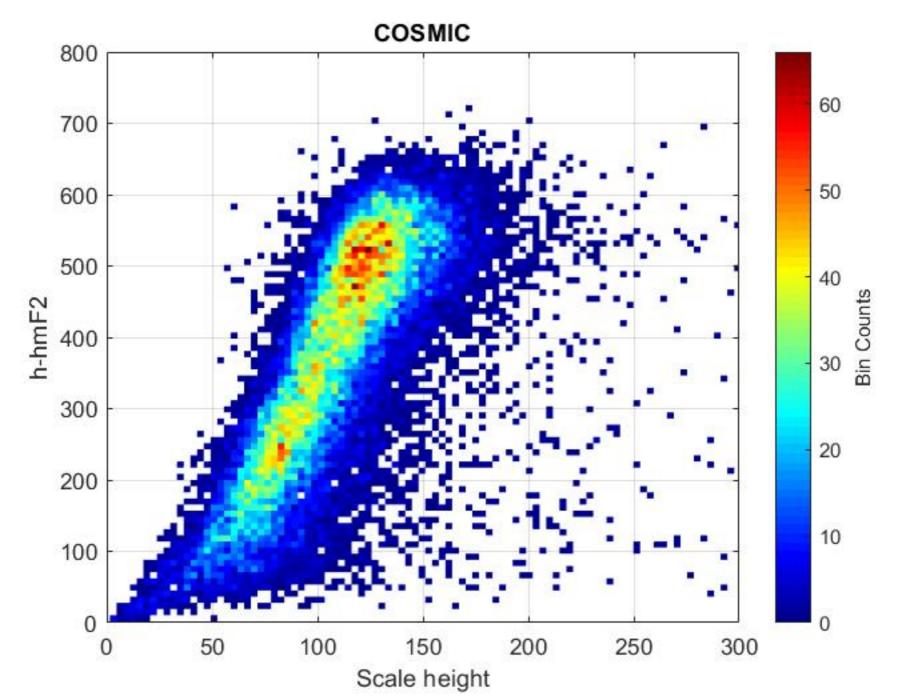
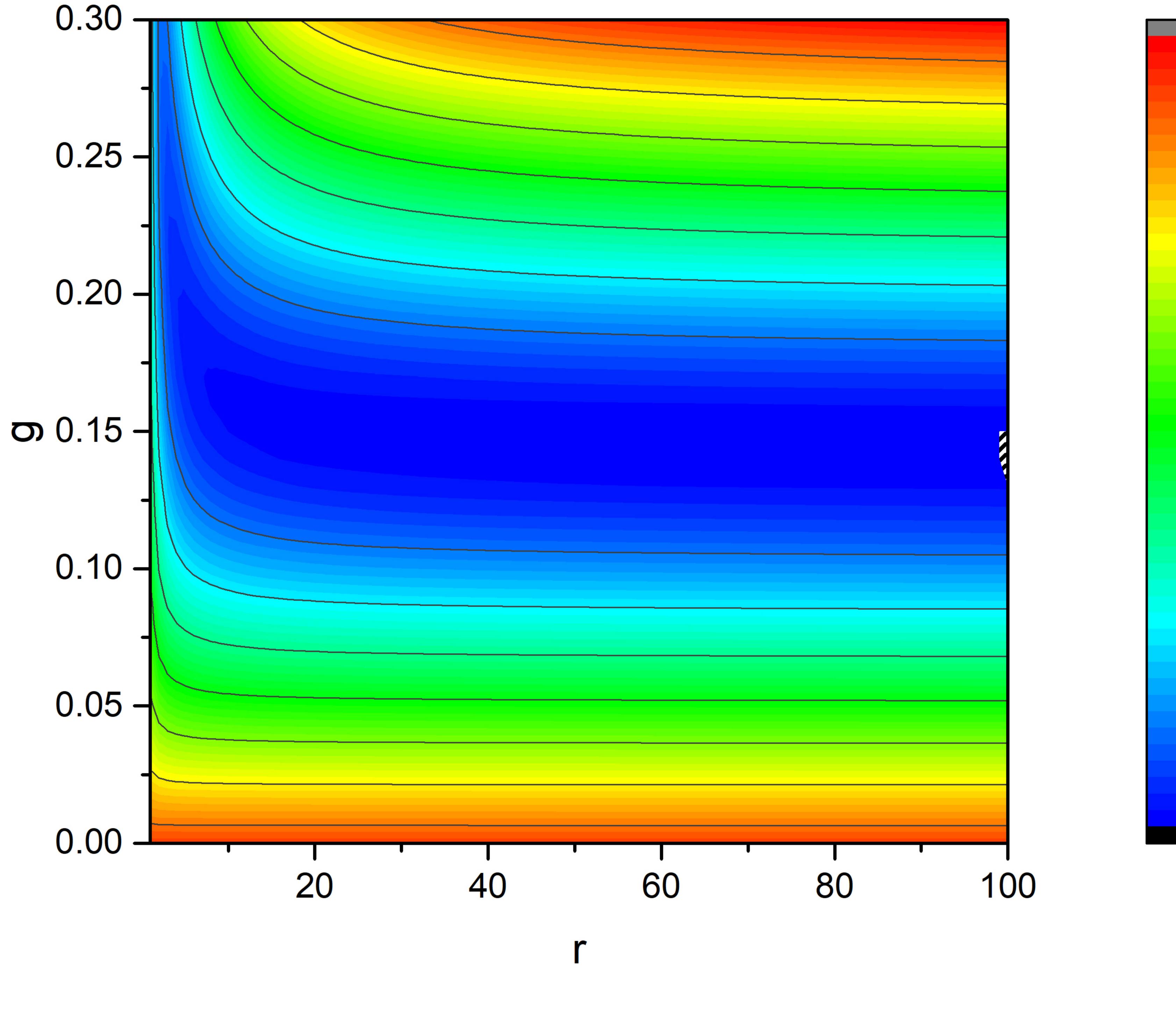


Figure 6.

COSMIC-Corrected NeQuick







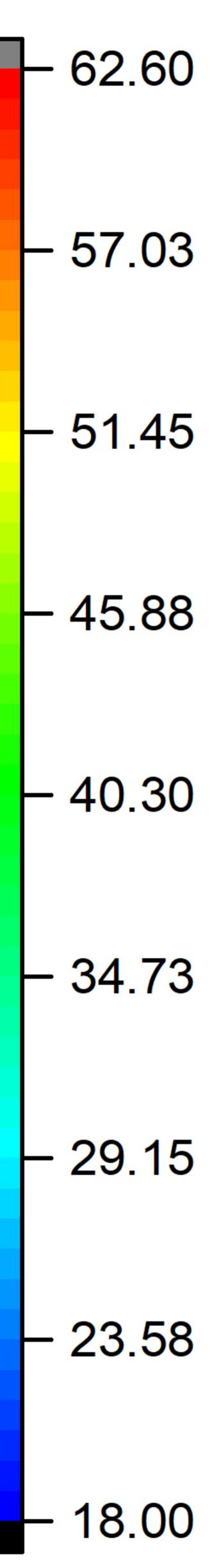
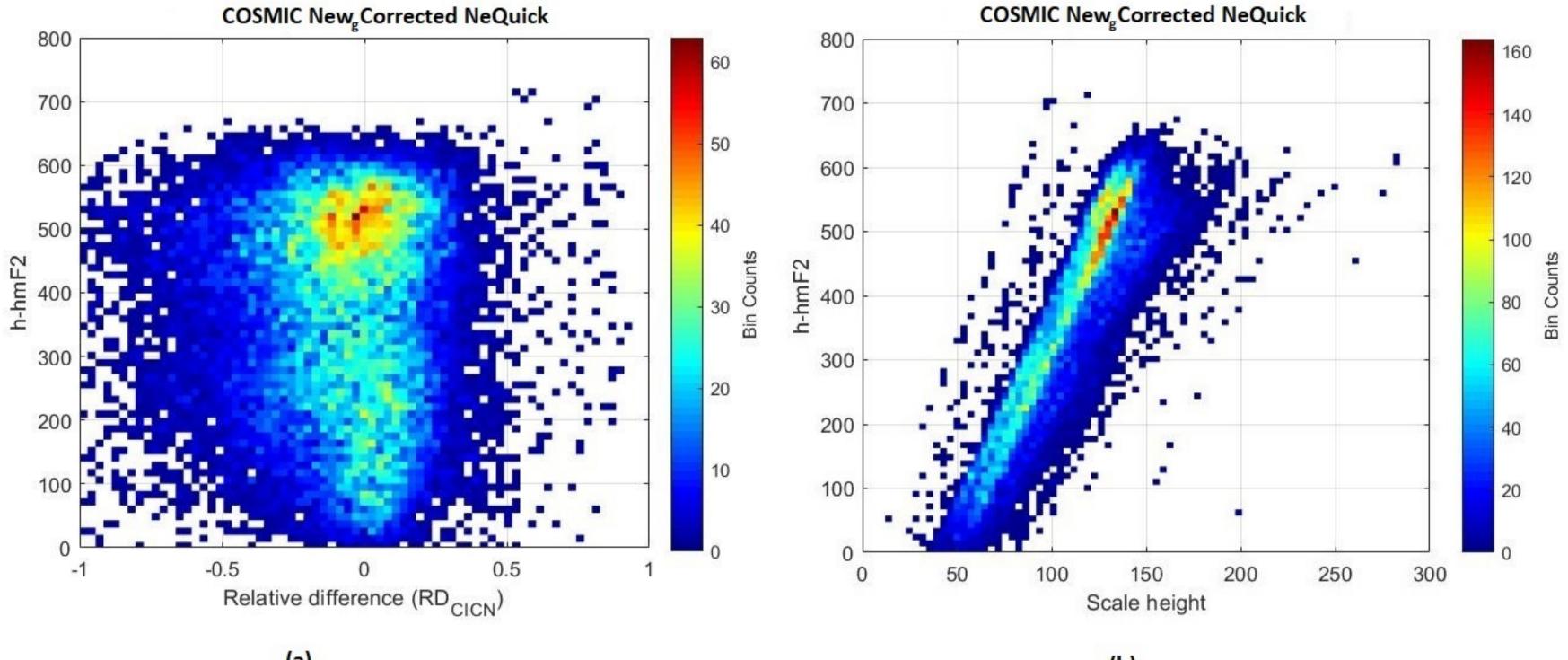
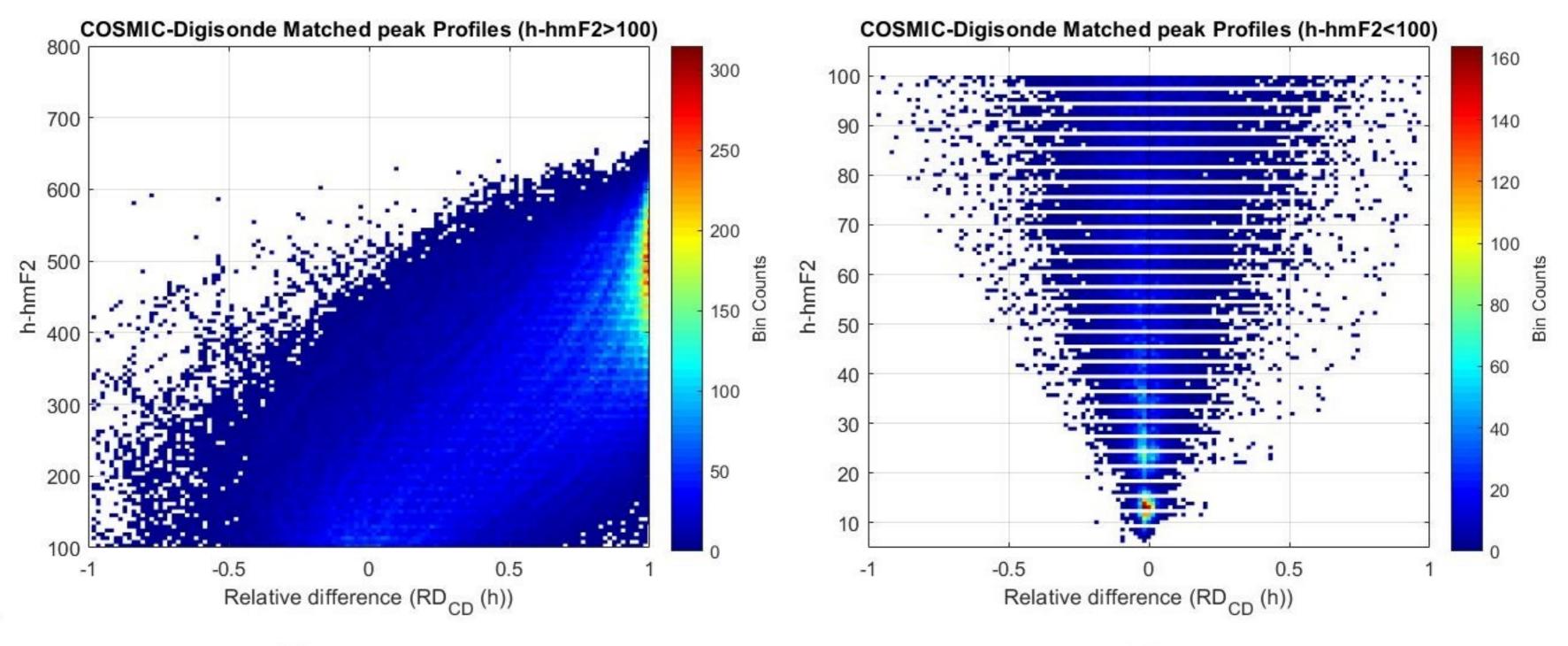


Figure 7.



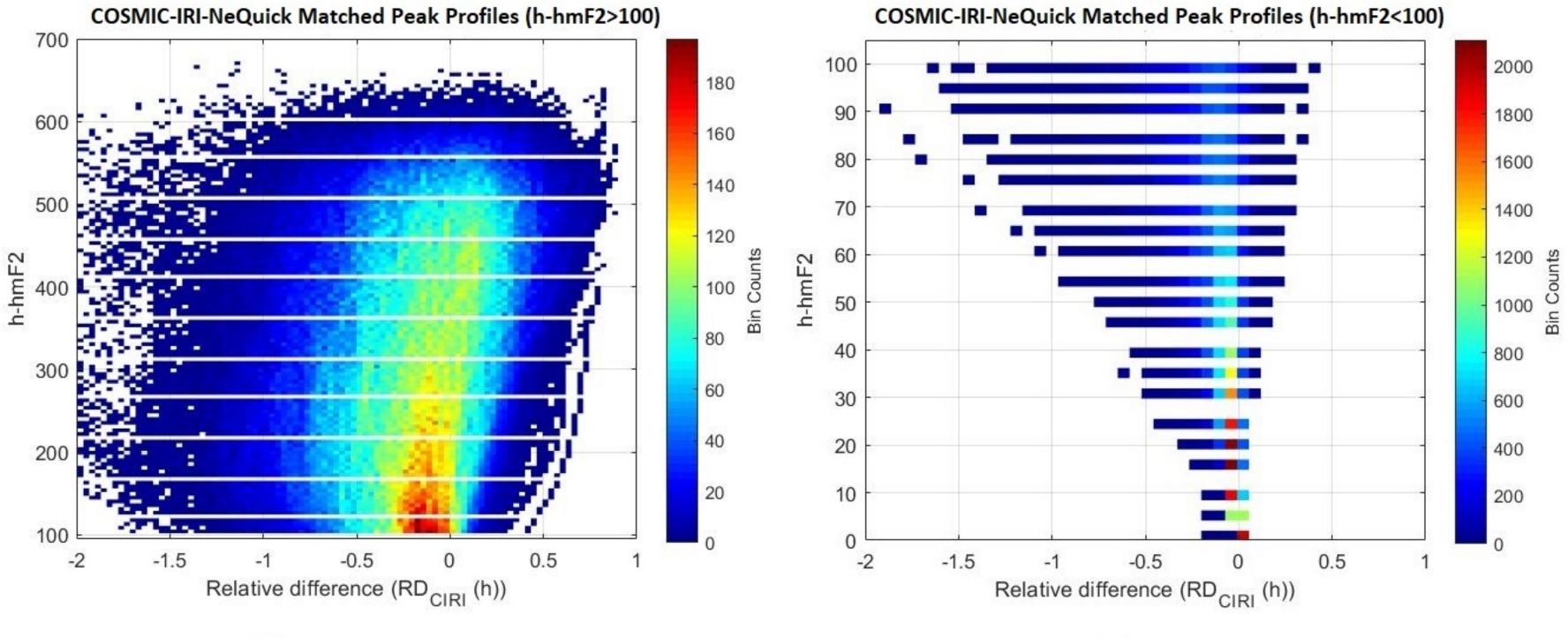
(a)

Figure 8.



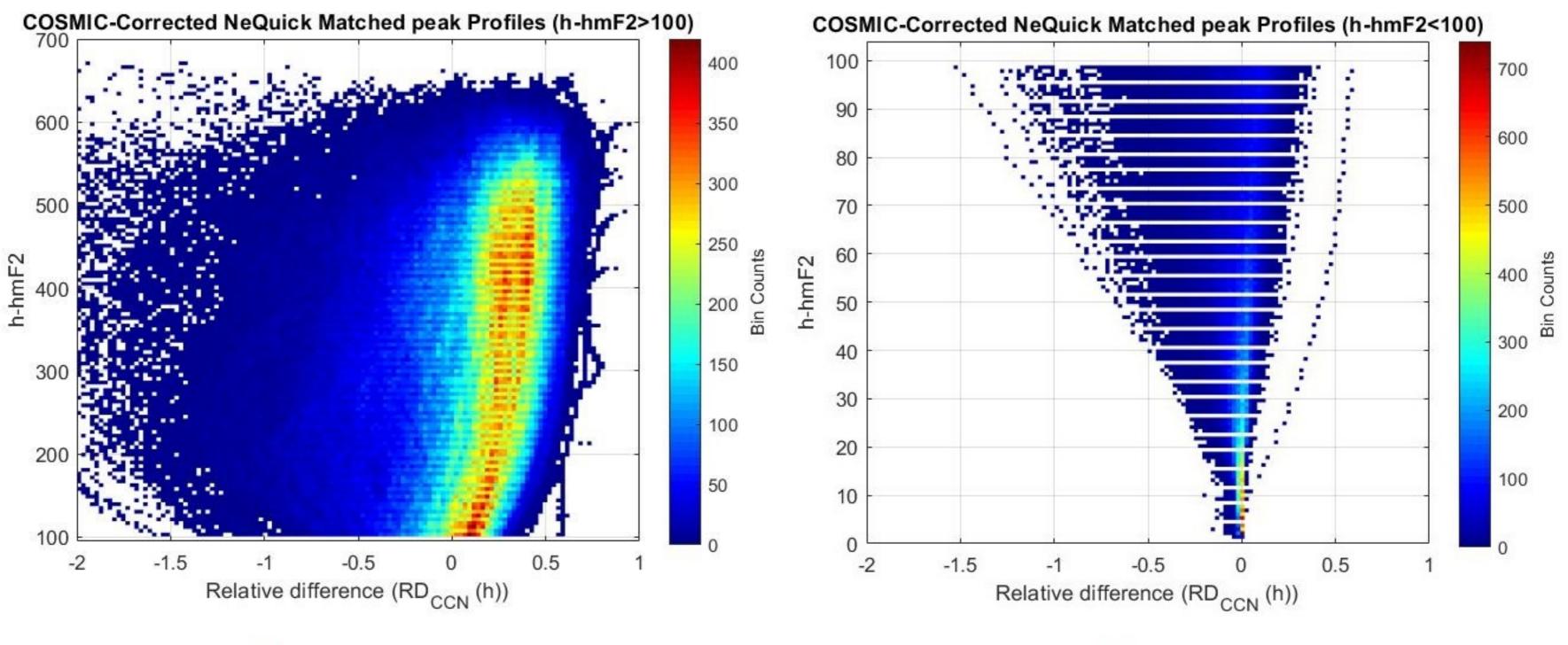
(a)

Figure 9.



(a)

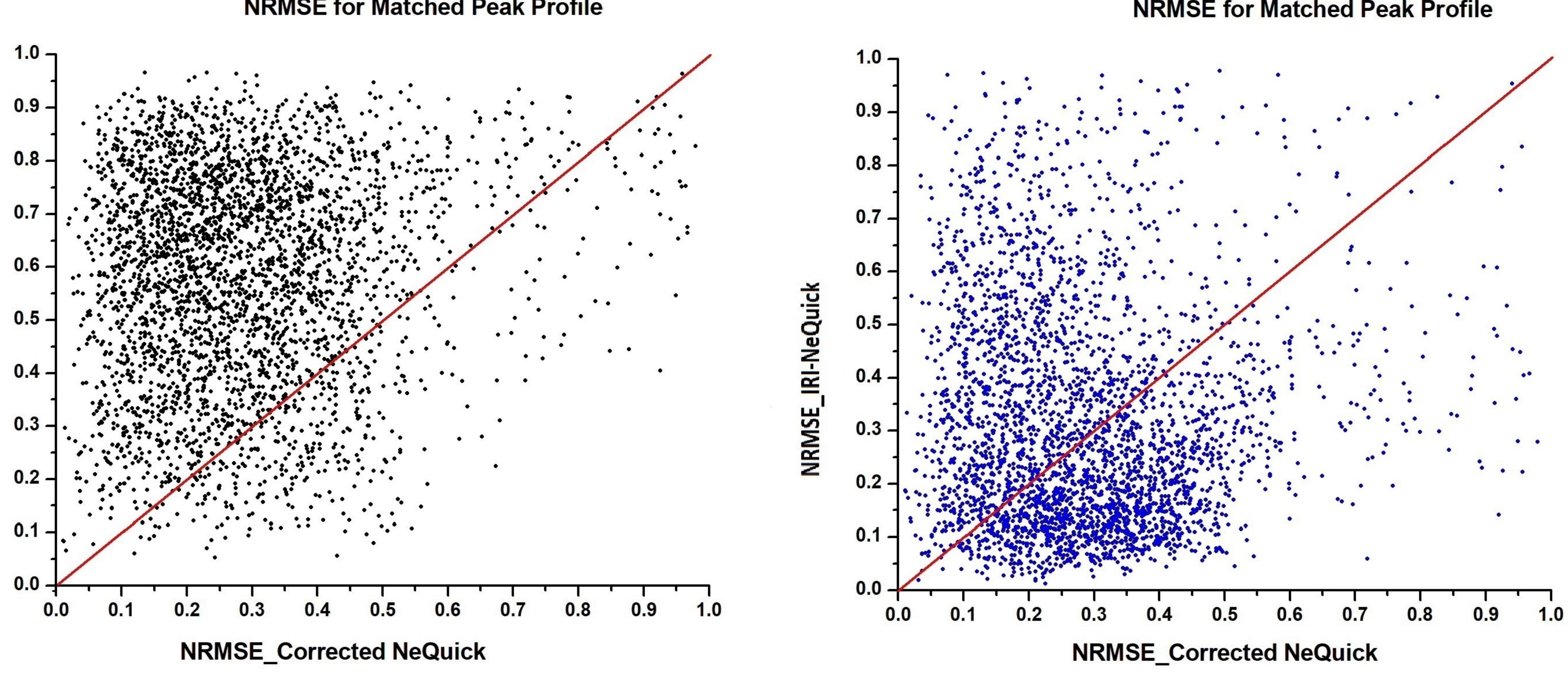
Figure 10.



⁽a)

Figure 11.

NRMSE for Matched Peak Profile



(a)

 $\overline{\Box}$

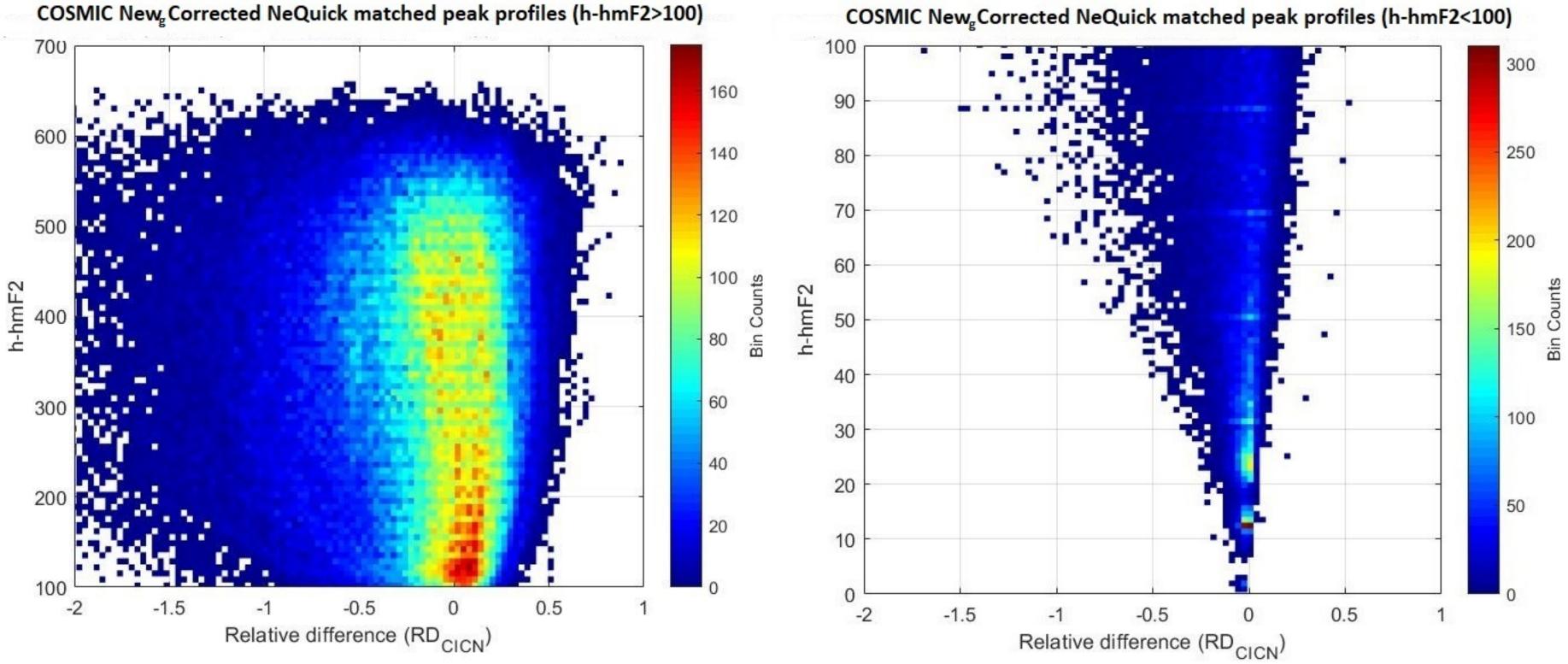
ш

NRMSE

NRMSE for Matched Peak Profile

(b)

Figure 12.



(a)

COSMIC New Corrected NeQuick matched peak profiles (h-hmF2<100)

Figure 13.

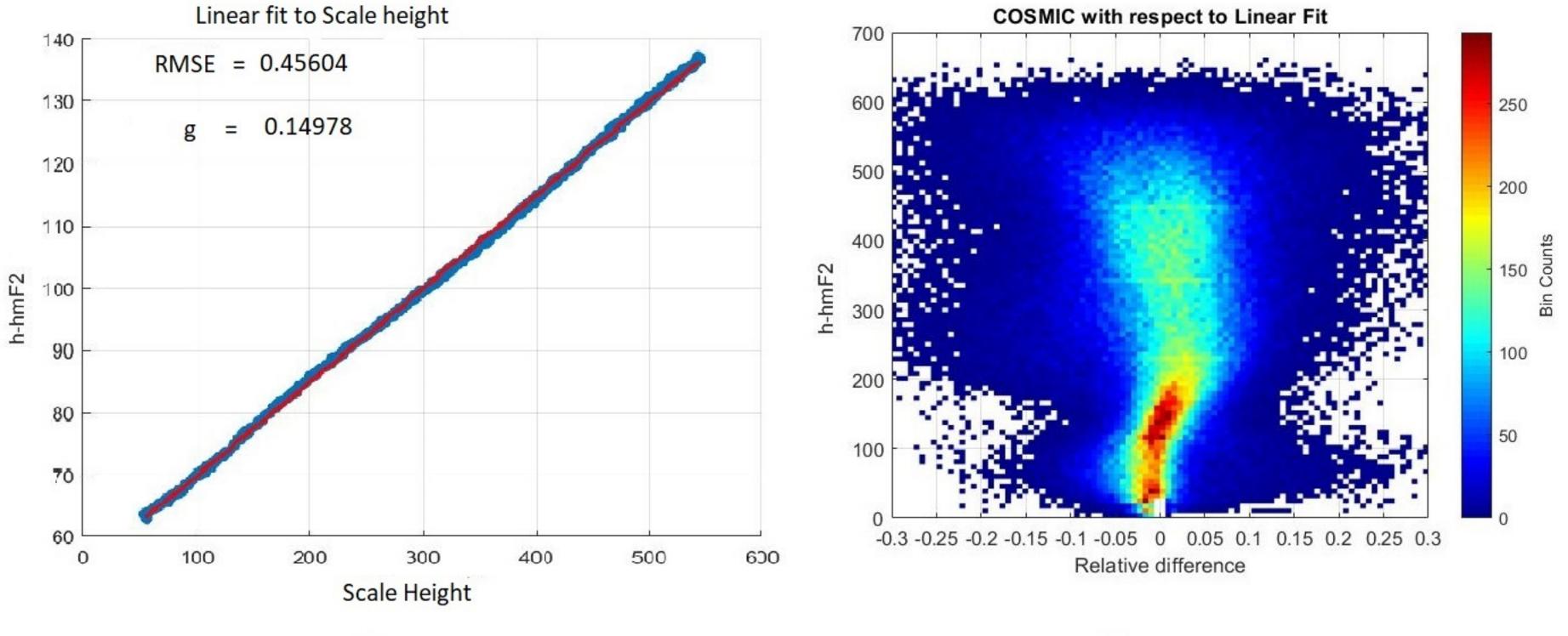


Figure 14.

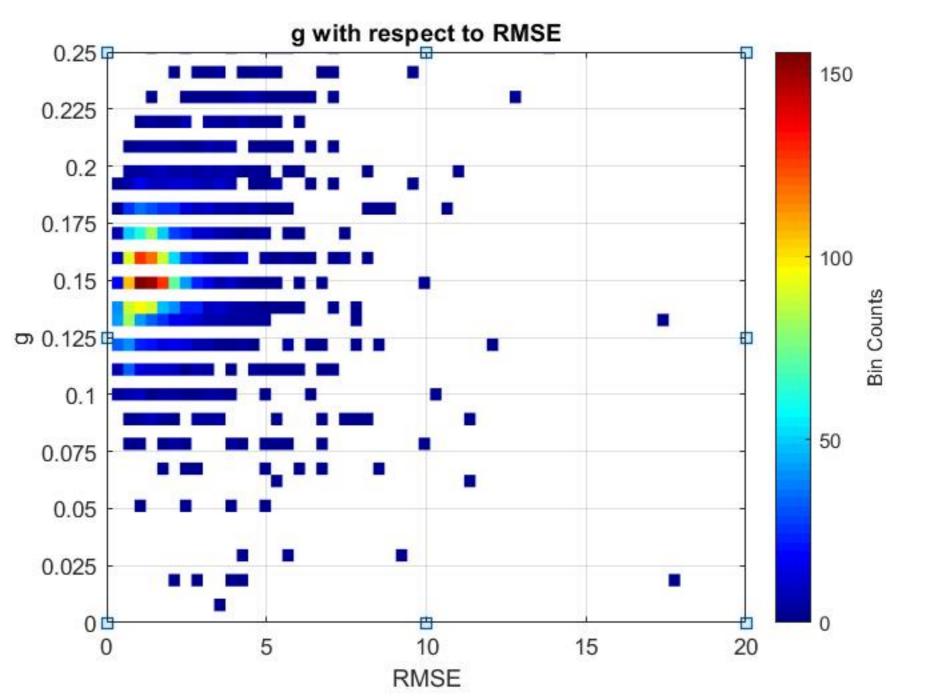


Table 1	
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Station name (Country)	Geog. Lat. (°)	Geog. Lon. (°)	Geo Mag. Lat.(°)	Number of Coincident observations	Number of Matched Peak Profiles
Alpena (Michaigan)	45.07	-83.56	46.94	93	8
Arenosillo (Spain)	37.1	-6.7	30.82	701	55
Arguello (USA)	34.8	-120.5	40.31	429	28
Ascension Island (UK)	-7.95	-14.4	-18.28	542	49
Athens (Greece)	38	23.5	31.98	997	75
Austin (USA)	30.4	-97.7	32.60	238	55
Boa (Brazil)	2.88	60.7	5.62	46	2
Boulder (USA)	40	-105.3	48.35	1057	126
Dourbes (Belgium)	50.1	4.6	45.90	1637	249
Eielson (Alaska)	64.6	-147.7	65.65	224	33
Fortaleza (Brazil)	-3.9	-38.4	-6.41	234	14
Gakona (USA)	62.4	-145	62.99	1246	101
Goose Bay (Canada)	62.38	-145	60.46	229	30
Grahamstown (South Africa)	-33.3	26.5	-41.38	950	96
Guam	13.6	144.86	16.13	85	14

Hermanus (South Africa)	-34.42	19.22	30.99	885	164
ICheon (South Korea)	37.14	127.54	39.20	478	60
Idaho (USA)	43.81	-112.67	45.71	379	59
Jeju (South Korea)	33.43	126.3	26.81	562	83
Jicamarca (Peru)	-12	-76.8	0.09	283	12
Juliusruh (Germany)	54.6	13.4	50.71	1141	163
Kwajalein (Marshall isl.)	9	167.2	3.85	235	16
Learmonth (Australia)	-21.8	114.1	-32.25	607	65
Louisvale (South Africa)	-28.5	21.2	-37.67	688	100
Madimbo (South Africa)	-22.39	30.88	-32.33	1668	224
Millstone Hill (USA)	43.6	-71.5	51.77	1637	186
Moscow (Russia)	55.5	37.3	51.34	614	102
Nicosia (Cyprus)	35.14	33.2	29.23	468	27
Nord (Greenland)	81.4	-17.5		43	1
Pruhonice (Czech Republic)	50	14.6	45.49	1230	288
Ramey (Puerto Rico)	18.5	-67.1	27.59	390	57
Rome	41.9	12.5	36.03	858	108

(Italy)					
Roquetes (Spain)	40.8	0.5	34.98	1307	160
King Salmon (USA)	58.4	-156.4	56.89	795	87
Sanya (China)	18.34	109.42	20.78	124	3
Sao Luis (Brazil)	-2.6	-44.2	-2.27	203	12
Sondrestrom (Greenland)	66.98	-50.94	72.28	610	46
Port Stanley (Falkland isl.)	-51.6	-57.9	-38.88	1376	155
Thule (Greenland)	76.54	-68.44	76.05	143	11
Tromso (Norway)	69.58	19.22	66.52	897	135
San Vito (Italy)	40.6	17.8	34.73	758	104
Wallops Island (USA)	37.94	-75.58	47.83	1318	09
Wuhan (China)	30.5	114.4	32.70	75	10
Yakutsk (Russia)	62	129.6	56.33	583	51
Total				29,063	3433