



1 **Inter-comparison of retrievals of Integrated Precipitable Water Vapour (IPWV) made by**  
2 **INSAT-3DR satellite-borne Infrared Radiometer Sounding and CAMS reanalysis data**  
3 **with ground-based Indian GNSS data.**

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7 **Abstract:**

8 The spatiotemporal variations of integrated precipitable water vapor (IPWV) are very important  
9 to understand the regional variability of water vapour. Traditional in-situ measurements of IPWV  
10 in Indian region are limited and therefore the performance of satellite and Copernicus Atmosphere  
11 Meteorological Service (CAMS) retrievals with Indian Global Navigation Satellite System  
12 (GNSS) taking as reference has been analyzed. In this study the CAMS reanalysis retrieval one  
13 year (2018), Indian GNSS and INSAT-3DR sounder retrievals data for one & half years (January-  
14 2017 to June-2018) has been utilized and computed statistics. It is noticed that seasonal correlation  
15 coefficient (CC) values between INSAT-3DR and Indian GNSS data mainly lie within the range  
16 of 0.50 to 0.98 for all the selected 19 stations except Thiruvananthapuram (0.1), Kanyakumari (0.31),  
17 Karaikal (0.15) during monsoon and Panjim (0.2) during post monsoon season respectively. The  
18 seasonal CC values between CAMS and INSAT-3DR IPWV are ranges 0.73 to .99 except Jaipur  
19 (0.16) & Bhubneshwar (0.29) during pre-monsoon season, Panjim (0.38) during monsoon, Nagpur  
20 (0.50) during post-monsoon and Dibrugarh (0.49) Jaipur (0.58) & Bhubneshwar (0.16) during  
21 winter season respectively. The root mean square error (RMSE) values are higher under the wet  
22 conditions (Pre Monsoon & Monsoon season) than under dry conditions (Post Monsoon & Winter  
23 season) and found differences in magnitude and sign of bias of INSAT-3DR, CAMS with respect  
24 to GNSS IPWV from station to station and season to season.

25 This study will help to improve understanding and utilization of CASMS and INSAT-3DR data  
26 more effectively along with GNSS data over land, coastal and desert locations in term of seasonal  
27 flow of IPWV which is an essential integrated variable in forecasting applications.

28

29 **Keywords:** Indian Satellite -3DR (INSAT-3DR), Integrated Precipitable Water Vapour (IPWV),  
30 Copernicus Atmospheric Monitoring Service (CAMS) & Global Navigation Satellite System  
31 (GNSS).

32



### 33 **Introduction**

34 The vertically integrated precipitable water vapour (IPWV) content in the atmosphere is a  
35 parameter of great importance in all studies of the atmosphere and its properties through the year  
36 in all seasons. The assessment of IPWV is done by many ways as in situ or remote sensing  
37 measurements. The in situ measurements have limited coverage, expensive and require  
38 maintenance of all the time. Remote sensing instruments, especially absorption in the infrared and  
39 microwave region of solar spectrum have wide coverage, cheaper, almost maintenance free but  
40 needs to be validated their retrieval performance and inter comparison before applying in the  
41 operational meteorological service domain. Water vapour, one of the most influential constituents  
42 of the atmosphere, is responsible for determine the amount of precipitation that a region can receive  
43 (Trenberth et al, 2003). Integrated precipitable water vapor (IPWV) is a meteorological factor that  
44 shows the amount of water vapour contained in the coloumn of air per unit area of the atmosphere  
45 in terms of the depth of liquid (Viswanadham et al., 1981). The surface radiation is completely  
46 absorbed by atmospheric water vapour on its way to the satellite. Each absorbing water vapour  
47 molecule emits radiation according to Planck's law, mainly depending on its temperature and the  
48 extent of absorption differs depending on the wavelength, the satellite sees different levels of  
49 atmosphere.

50 Geo-stationary Earth Orbit (GEO) satellites can produce data more timely and frequently. The  
51 retrieved high temporal resolution, Integrated Precipitable Water vapour (IPWV) from GEO  
52 satellites sensor data can be utilized to monitor pre-convective environments and predict heavy  
53 rainfall, convective storms, and clouds that may cause serious damage to human life and  
54 infrastructure (Martinez et al., 2007; Liu et al., 2019; Lee et al., 2015). At present two advanced  
55 Indian geostationary meteorological satellites INSAT-3D (launched on 26 July, 2013) and INSAT-  
56 3DR on 6 September, 2016) with similar sensor characteristics are orbiting over Indian Ocean  
57 region and are placed at 82° E and 74° E respectively. INSAT -3D & INSAT-3DR both satellites  
58 are equipped with the infrared sounders with 19 channels, which are used to provide  
59 meteorological parameters like the profiles of temperature, humidity and ozone, atmospheric  
60 stability indices, atmospheric water vapor, etc. at 1 hour (sector A) and 1.5 hour (sector B)  
61 intervals (Kishtawal et al., 2019). Temperature and humidity (T-q profile) is used to retrieve  
62 thermodynamic indices which is useful in analyzing the strength and severity of severe weather  
63 events. Therefore, IPWV is one of the critical variables used by forecasters when severe weather  
64 conditions are expected (Lee et al., 2016). Copernicus Atmosphere Monitoring Service (CAM5)  
65 global reanalysis (EAC4) latest data set of atmospheric composition has been built at approximate  
66 80 km resolution with much improved biases and consistent with time. (Inness et al., 2019).The  
67 concept of GNSS meteorology was first introduced by Bevis et al.,1992& 1994andBusingeret al.,  
68 1992 and IPWV data were estimated from Global Navigation Satellite System (GNSS)  
69 observations. In the present study we have taken 19 Indian GNSS stations (10 inland, 8 coastal  
70 and 1 desert) or sites for study. Earlier studies (Jade et al., 2005; Jade and Vijayan et al., 2008;



71 Puviarasan et al., 2014) of water vapour over the Indian subcontinent and surrounding ocean have  
72 shown strong seasonal variations.

73 The behavior of coastal regions are generally different from inland and desert stations as coastal  
74 regions is greatly influenced moisture advection from breezing of the seas, which is the cause of  
75 the continuous increment of IPWV even after the air temperature decreased (Ortiz de Galisteo et  
76 al., 2011).

77 Perez-Ramirez, D. et al. 2014, compared Aerosol Robotic Network (AERONET) precipitable  
78 water vapour retrievals from Sun photometers with radiosonde, ground based Microwave  
79 radiometry, GPS and found a consistent dry bias approximately 5-6 % with total uncertainties of  
80 12-15 % in the retrievals of precipitable water vapour from AERONET. In this paper, CAMS &  
81 INSDAT-3DR retrieval has been compared and statistically analyzed with GNSS data taking as  
82 reference.

## 83 **2. Methodology and Data collection**

84 The measured Integrated Perceptible Water Vapour (IPWV) from the IMD GNSS network with  
85 15 minute temporal resolution data are used for the comparison of INSAT-3DR geostationary  
86 satellite IPWV products and CAMS reanalysis IPWV data. The INSAT-3DR data scans are each  
87 of one hour intervals from January-2017 to June-2018. These measured and derived IPWV  
88 products are arranged as co-location of both temporal and spatial. The spatial views of the  
89 observational locations of GNSS and along with INSAT-3DR IPWV annual mean values are  
90 shown in Figure 2. The number of observational points (N) of each GNSS, INSAT3DR and CAMS  
91 reanalysis of each station with its latitude, longitude are shown in Table-1. Here, winter season is  
92 considered as December, January and February months; pre monsoon season is considered as  
93 March, April and May; monsoon season in June, July and August months; finally post monsoon  
94 season is considered as September, October and November months. Statistical evaluation of the  
95 data has been done by using freely available open source R software.

### 96 **2.1 Analysis of statistical skill scores**

97 The collocated comparison statistics with matchup data set is used to evaluate the statistical  
98 performance of retrievals of INSAT-3DR and CAMS with respect to GNSS IPWV over Indian  
99 region.

100 The statistical metrics used for quantitative evaluation are, linear correlation coefficient (CC),  
101 Standard Deviation (SD), Bias and Root Mean Square Error (RMSE).The computation of above  
102 said statistical metrics are given below:

103 Let,  $O_i$  represents the  $i^{\text{th}}$  observed value of INSAT3DR or CAMS reanalysis data and  $M_i$  represents  
104 the  $i^{\text{th}}$  GNSS IPWV value for a total of n observations.

105



106 Mean bias (MB)

$$107 \quad MB = \frac{1}{n} \sum_{i=1}^N M_i - O_i$$

108

109 Root Mean Squared Error (RMSE)

$$110 \quad RMSE = \sqrt{\frac{1}{N} \sum_{i=1}^N (M_i - O_i)^2}$$

111

112 Correlation Coefficient (r)

113

$$114 \quad CC = \frac{N(\sum_{i=1}^N M_i O_i) - (\sum_{i=1}^N M_i)(\sum_{i=1}^N O_i)}{\sqrt{[N \sum_{i=1}^N M_i^2 - (\sum_{i=1}^N M_i)^2][N \sum_{i=1}^N O_i^2 - (\sum_{i=1}^N O_i)^2]}}$$

115 Standard Deviation (SD)

116

$$117 \quad SD = \sqrt{\left\{ \frac{[N \sum_{i=1}^N (M_i - \bar{M})^2][N \sum_{i=1}^N (O_i - \bar{O})^2]}{N} \right\}}$$

118

## 119 2.2 Integrated Precipitable Water Vapour retrievals from INSAT-3DRSonder data

120 Sounding system of the INSAT-3DR satellite have the capability to provides vertical profiles of  
121 temperature (40 levels from surface to ~ 70 km) and humidity (21 levels from surface to ~ 15 km)  
122 from surface to top of the atmosphere. Vertical profiles of temperature and moisture can be derived  
123 from radiances in 19 channels, using the first guess from NWP data. INSAT-3DR sonder  
124 channels brightness temperature values are averaged over a number of field of view (FOVs) prior  
125 to application of retrieval algorithm. Based on this, retrieval algorithm has option for retrieving  
126 the vertical profiles at 30 km (3 × 3 pixels) and 10 km resolution (each pixel). The Sounder has  
127 eighteen narrow spectral channels in shortwave infrared, middle infrared and long wave infrared  
128 regions and one channel in the visible region. The ground resolution at nadir is 10 × 10 km for all  
129 nineteen channels. Specifications of sonder channels are given in Table-1.

130 As INSAT-3DR IPWV is sensitive to the presence of clouds in the field of view (limitation of  
131 Infra-red sonder sensors), hence the IPWV values collected under clear sky conditions were used  
132 in this study. Atmospheric profile retrieval algorithm for INSAT-3DR Sounder is a two-step



133 approach. The first step includes generation of accurate hybrid first guess profiles using  
134 combination of statistical regression retrieved profiles and model forecast profiles. The second  
135 step is nonlinear physical retrieval to improve the resulting first guess profile using Newtonian  
136 iterative method. The retrievals are performed using clear sky radiances measured by sounder  
137 within a 3x3 field of view (approximately 30x30 km resolution) over land for both day and night  
138 (similar to INSAT-3D ATBD, 2015). Four sets of regression coefficients are generated, two sets  
139 for land and ocean daytime conditions and the other two sets for land and ocean night-time  
140 conditions using a training dataset comprising historical radiosonde observations representing  
141 atmospheric conditions over INSAT-3DR observation region. Integrated Precipitable Water  
142 Vapour in mm can be given as:

143 
$$PWV = \int_{p_1}^{p_2} \frac{q}{g\rho_w} dp$$

144 Where, 'g' is the acceleration of gravity,  $p_1$  = surface pressure,  $p_2$  = top of atmosphere pressure  
145 (i.e. about 100 hPa beyond which water vapour amount is assumed to be in negligible). Unit of  
146 precipitable water is mm depth of equal amount of liquid water above a surface of one square  
147 meter. IMD is computing IPWV from 19 channel sounder of INSAT-3DR in three layers i.e. 1000-  
148 900 hPa, 900-700 hPa, 700-300 hPa and total PWV in the vertical column of atmosphere stretching  
149 from surface to about 100 hPa during cloud free condition. Monsoon, severe weather, cloudy  
150 condition puts the limitation for sounder profile (Venkat Ratnam et al., 2016). The GNSS and  
151 INSAT-3DR retrieved IPWV values are matched at every hour.

### 152 **2.3 Scan Strategy of INSAT-3DR Sounder**

153 The Sounder measures radiance in eighteen IR and one visible channel simultaneously over an  
154 area of area of 10 km x 10 km at nadir every 100 ms. Using a two-axes gimbaled scan mirror, this  
155 footprint can be positioned anywhere in the FOR. A scan program mode allows sequential  
156 sounding of a selected area with periodic space and calibration looks. In this mode, a 'frame'  
157 consisting of multiple 'blocks' of the size 640 km x 640 km, can be sounded. The selected frame  
158 can be placed anywhere within a 24° (E-W) x 19° (N-S) FOR. It takes almost three hours to sound  
159 an area of 6400 km x 6400 km in size. The full aperture internal Black-body calibration is  
160 performed every 30 min or on command based whenever. This enables the derivation of vertical  
161 profiles of temperature and humidity. These vertical profiles can then be used to derive various  
162 atmospheric stability indices and other parameters such as atmospheric water vapor content and  
163 total column ozone amount. Figure 1 shows the areas over the Indian land mass (A) and over the  
164 some parts of Indian land mass and Indian Ocean (B). The Indian land mass area (A) is scanned  
165 every hour and one & half hour interval for some parts of Indian land mass and Indian Ocean (B).  
166 This scanning strategy is kept in such a way that sounding over an Indian land mass area will be  
167 available every hour. Scan strategy and area of coverage of INSAT -3DR is shown below in the  
168 Figure 1.



#### 169 **2.4 IMD IPWV observation network**

170 The ground based GNSS IPWV estimated at a high temporal sampling (15 minute) data (January  
171 2017- June 2018) of Indian GNSS network is processed at satellite division of India  
172 Meteorological Department, Lodi Road, New Delhi. The data is processed daily by using the  
173 Trimble Pivot Platform (TPP) software. The data is used operationally and archive as daily,  
174 weekly, monthly as well as seasonal basis for future utilization and dissemination to the users,  
175 researchers as per the official norms. Tome series of three years of GNSS data is prepared to  
176 generate the diurnal variation of IPWV. An elevation angle of greater than  $5^\circ$  is set for all stations  
177 to avoid the satellite geometry change and multipath effects. This is an optimum setting as a higher  
178 cut off angle ( $> 5^\circ$ ) may introduce dry bias in the IPWV estimation and notable 0.8 mm error in  
179 IPWV (Emardson et al., 1998).

#### 180 **2.5 INSAT-3DR and GNSS retrievals matchup criteria**

181 The assessment of accuracy of INSAT-3DR satellite retrieved IPWV with 19 GNSS stations in  
182 different geographical locations which are located in coastal, inland and desert regions over the  
183 Indian subcontinent and are shown in the Table 2. The GNSS IPWV data sampled every 15 minute  
184 and to maintain consistency with INSAT-3DR retrievals those are available every one hour interval  
185 of time over the Indian region for the period 1<sup>st</sup> January 2017 to 30<sup>th</sup> June 2018 have been utilized.  
186 Matchup data sets for were prepared for INSAT-3DR and GNSS IPWV as per the following  
187 criteria

188 (1) To reduce the local horizontal gradient arising in IPWV, The absolute distance between the  
189 position of the GNSS stations locations are set within the  $0.25^\circ$  latitude and longitude of the  
190 INSAT-3DR retrievals in the region surrounding the stations.

191 (2) The temporal resolution selected of INSAT-3DR and 19 GNSS observations is within 30 min  
192 time interval depending on retrievals and the location of the GNSS stations.

193 (3) The INSAT-3DR IPWV retrievals are interpolated to different geographical locations of 19  
194 GNSS observations.

#### 195 **2.6 Copernicus Atmosphere Monitoring Service (CAMS) reanalysis data**

196 The CAMS reanalysis was produced using 4DVar data assimilation in European Centre for  
197 Medium Range Weather Forecasts (ECMWF's) Integrated Forecasting System (IFS), with 60  
198 hybrid sigma/pressure (model) levels in the vertical, with the top level at 0.1 hPa. Atmospheric  
199 data are available on these levels and they are also interpolated to 25 pressure levels, 10 potential  
200 temperature levels and 1 potential vorticity level (Inness et al., 2019). This new reanalysis data set  
201 has horizontal resolution of about 80 km ( $0.75^\circ \times 0.75^\circ$ ), smaller biases for reactive gases and  
202 aerosols, improved and more consistent with time as compared to earlier versions. Collocation  
203 match up has been created at  $0.75^\circ \times 0.75^\circ$  (about 80 km) spatial resolution for comparison and



204 performance with INSAT-3DR. Temporal domain are selected at 00, 03, 06, 09, 12, 15, 18, 21  
 205 UTC time interval for Indian GNSS along with INSAT-3DR at 03, 09, 15, 21 UTC for  
 206 performance analysis. The CAMS reanalysis IPWV retrievals are interpolated to different  
 207 geographical locations of 19 GNSS observations.

208 Table-1 INSAT-3DR Sounder channel specifications

| INSAT-3DR Sounder Channels Characteristics |             |                         |                         |                          |
|--|-------------|-------------------------|-------------------------|--------------------------|
| Detector                                   | Channel No. | Central Wavelength (mm) | Principal absorbing gas | Purpose                  |
| Long wave                                  | 1           | 14.67                   | CO <sub>2</sub>         | Stratosphere temperature |
|  | 2           | 14.32                   | CO <sub>2</sub>         | Tropopause temperature   |
|  | 3           | 14.04                   | CO <sub>2</sub>         | Upper-level temperature  |
|  | 4           | 13.64                   | CO <sub>2</sub>         | Mid-level temperature    |
|  | 5           | 13.32                   | CO <sub>2</sub>         | Low-level temperature    |
|  | 6           | 12.62                   | water vapor             | Total precipitable water |
|  | 7           | 11.99                   | water vapor             | Surface temp., moisture  |
| Mid wave                                   | 8           | 11.04                   | Window                  | Surface temperature      |
|  | 9           | 9.72                    | Ozone                   | Total ozone              |
|  | 10          | 7.44                    | water vapor             | Low-level moisture       |
|  | 11          | 7.03                    | water vapor             | Mid-level moisture       |
|  | 12          | 6.53                    | water vapor             | Upper-level moisture     |
| Short wave                                 | 13          | 4.58                    | N <sub>2</sub> O        | Low-level temperature    |



|         |    |       |                  |                         |
|---------|----|-------|------------------|-------------------------|
|         | 14 | 4.53  | N <sub>2</sub> O | Mid-level temperature   |
|         | 15 | 4.46  | CO <sub>2</sub>  | Upper-level temperature |
|         | 16 | 4.13  | CO <sub>2</sub>  | Boundary-level temp.    |
|         | 17 | 3.98  | Window           | Surface temperature     |
|         | 18 | 3.76  | Window           | Surface temp., moisture |
| Visible | 19 | 0.695 | Visible          | Cloud                   |

209

210 Table 2: List of GNSS stations (latitude, longitude, height) and location environment

| S.No | Station            | Station code | Long  | Lat   | Ellipsoid Height(m) | Environment |
|------|--------------------|--------------|-------|-------|---------------------|-------------|
| 1    | Aurangbad          | ARGD         | 75.39 | 19.87 | 528.13              | Inland      |
| 2    | Bhopal             | BHPL         | 77.42 | 23.24 | 476.22              | Inland      |
| 3    | Dibrugarh          | DBGH         | 95.02 | 27.48 | 55.76               | Inland      |
| 4    | Delhi              | DELH         | 77.22 | 28.59 | 165.06              | Inland      |
| 5    | Jabalpur           | JBPR         | 79.98 | 23.09 | 355.09              | Inland      |
| 6    | Jaipur             | JIPR         | 75.81 | 26.82 | 335.37              | Inland      |
| 7    | Jalpaiguri         | JPGI         | 88.71 | 26.54 | 37.41               | Inland      |
| 8    | Pune               | PUNE         | 73.88 | 18.53 | 487.72              | Inland      |
| 9    | Raipur             | RIPR         | 81.66 | 21.21 | 245.56              | Inland      |
| 10   | Nagpur             | NGPR         | 79.06 | 21.09 | 253.57              | Inland      |
| 11   | Dwarka             | DWRK         | 68.95 | 22.24 | -40.12              | Costal      |
| 12   | Gopalpur           | GOPR         | 84.87 | 19.3  | -15.94              | Costal      |
| 13   | Karaikal           | KRKL         | 79.84 | 10.91 | -79.07              | Costal      |
| 14   | Kanyakumari        | KYKM         | 77.54 | 8.08  | -49.23              | Costal      |
| 15   | Machilipattnam     | MPTM         | 81.15 | 16.18 | -61.07              | Costal      |
| 16   | Panjim             | PNJM         | 73.82 | 15.49 | -23.04              | Costal      |
| 17   | Thiruvananthapuram | TRVM         | 76.95 | 8.5   | -18.44              | Costal      |
| 18   | Bhubneshwar        | BWNR         | 85.82 | 20.25 | -16.72              | Costal      |
| 19   | Sriganganagar      | SGGN         | 73.89 | 29.92 | 132.17              | Desert      |

211



212 Table 3. Statistical analysis of IPWV retrievals from INSAT-3DR & GNSS data (January-2017  
 213 & June-2018).

| S. No | Station | N    | MB (mm) | RMSE (mm) | R    |
|-------|---------|------|---------|-----------|------|
| 1     | ARGD    | 2318 | -0.99   | 4.83      | 0.85 |
| 2     | BHPL    | 791  | 3.48    | 5.88      | 0.93 |
| 3     | DBGH    | 688  | -3.02   | 12.38     | 0.72 |
| 4     | DELH    | 1880 | -1.58   | 4.53      | 0.89 |
| 5     | NGPR    | 2032 | -0.10   | 4.32      | 0.89 |
| 6     | JBPR    | 952  | 1.96    | 4.39      | 0.93 |
| 7     | JIPR    | 1576 | 0.46    | 4.26      | 0.88 |
| 8     | JPGI    | 1551 | 2.25    | 8.10      | 0.75 |
| 9     | PUNE    | 567  | 0.69    | 6.18      | 0.83 |
| 10    | RIPR    | 1849 | 0.71    | 4.01      | 0.84 |
| 11    | BWNR    | 1443 | 1.51    | 5.61      | 0.88 |
| 12    | DWRK    | 2628 | 2.93    | 7.10      | 0.85 |
| 13    | GOPR    | 1850 | 0.76    | 7.59      | 0.82 |
| 14    | KRKL    | 1128 | 0.52    | 6.59      | 0.88 |
| 15    | KYKM    | 1574 | 1.91    | 7.21      | 0.80 |
| 16    | MPTM    | 1747 | 3.12    | 7.29      | 0.81 |
| 17    | TRVM    | 905  | 0.01    | 7.56      | 0.76 |
| 18    | PNJM    | 1396 | -2.93   | 9.28      | 0.67 |
| 19    | SGGN    | 1040 | -1.41   | 4.42      | 0.88 |

214

215 Table 4 Statistical seasonal analysis of retrievals of IPWV from INSAT-3DR and GNSS data

| Station | Season             | N    | MB (mm) | RMSE (mm) | R     |
|---------|--------------------|------|---------|-----------|-------|
| ARGD    | Pre Monsoon (MAM)  | 1129 | -2.10   | 4.14      | 0.86  |
|         | Monsoon (JJA)      | 73   | -0.53   | 5.50      | 0.49  |
|         | Post Monsoon (SON) | 271  | 3.02    | 6.23      | 0.90  |
|         | Winter (DJF)       | 845  | -0.84   | 5.10      | 0.67  |
| BHPL    | Pre Monsoon (MAM)  | 69   | -0.49   | 3.81      | 0.77  |
|         | Monsoon (JJA)      | 78   | 2.10    | 7.73      | 0.64  |
|         | Post Monsoon (SON) | 339  | 5.23    | 6.96      | 0.93  |
|         | Winter (DJF)       | 305  | 2.78    | 4.16      | 0.95  |
| DBGH    | Pre Monsoon (MAM)  | 214  | -1.96   | 6.69      | 0.72  |
|         | Monsoon (JJA)      | 83   | -12.39  | 14.71     | 0.64  |
|         | Post Monsoon (SON) | 79   | -22.52  | 27.74     | -0.28 |
|         | Winter (DJF)       | 312  | 3.68    | 7.39      | 0.48  |



|      |                    |     |       |       |      |
|------|--------------------|-----|-------|-------|------|
| DELH | Pre Monsoon (MAM)  | 793 | -1.44 | 3.98  | 0.85 |
|      | Monsoon (JJA)      | 84  | -5.79 | 7.90  | 0.92 |
|      | Post Monsoon (SON) | 230 | -0.76 | 5.13  | 0.92 |
|      | Winter (DJF)       | 773 | -1.51 | 4.36  | 0.79 |
| NGPR | Pre Monsoon (MAM)  | 772 | -1.42 | 4.06  | 0.85 |
|      | Monsoon (JJA)      | 25  | 0.39  | 5.41  | 0.57 |
|      | Post Monsoon (SON) | 254 | 1.08  | 5.86  | 0.90 |
|      | Winter (DJF)       | 981 | 0.61  | 4.00  | 0.83 |
| JBPR | Pre Monsoon (MAM)  | 438 | 1.51  | 4.79  | 0.84 |
|      | Monsoon (JJA)      | 11  | -4.05 | 4.43  | 0.92 |
|      | Post Monsoon (SON) | 50  | 1.89  | 3.94  | 0.98 |
|      | Winter (DJF)       | 453 | 2.54  | 4.02  | 0.94 |
| JIPR | Pre Monsoon (MAM)  | 505 | -0.44 | 3.86  | 0.83 |
|      | Monsoon (JJA)      | 70  | -3.84 | 5.89  | 0.92 |
|      | Post Monsoon (SON) | 383 | 1.34  | 4.48  | 0.89 |
|      | Winter (DJF)       | 618 | 1.13  | 4.21  | 0.71 |
| JPGI | Pre Monsoon (MAM)  | 527 | -1.59 | 6.88  | 0.79 |
|      | Monsoon (JJA)      | 67  | -6.69 | 9.25  | 0.75 |
|      | Post Monsoon (SON) | 161 | 9.43  | 10.91 | 0.65 |
|      | Winter (DJF)       | 796 | 4.09  | 8.07  | 0.50 |
| PUNE | Pre Monsoon (MAM)  | 333 | 0.03  | 6.65  | 0.72 |
|      | Monsoon (JJA)      | 63  | -3.10 | 5.09  | 0.67 |
|      | Post Monsoon (SON) | 170 | 3.35  | 5.54  | 0.79 |
|      | Winter (DJF)       | 1   | 5.90  | 5.90  | NaN  |
| RIPR | Pre Monsoon (MAM)  | 864 | -0.39 | 3.94  | 0.84 |
|      | Monsoon (JJA)      | 0   | NaN   | NaN   | NaN  |
|      | Post Monsoon (SON) | 68  | 4.83  | 6.09  | 0.75 |
|      | Winter (DJF)       | 917 | 1.45  | 3.88  | 0.77 |
| KRKL | Pre Monsoon (MAM)  | 739 | 0.03  | 5.29  | 0.89 |
|      | Monsoon (JJA)      | 105 | -0.58 | 8.54  | 0.15 |
|      | Post Monsoon (SON) | 31  | -1.88 | 8.54  | 0.59 |
|      | Winter (DJF)       | 253 | 2.68  | 8.53  | 0.63 |
| KYKM | Pre Monsoon (MAM)  | 686 | 0.31  | 5.84  | 0.79 |
|      | Monsoon (JJA)      | 110 | -1.73 | 9.53  | 0.31 |
|      | Post Monsoon (SON) | 155 | 0.88  | 11.21 | 0.50 |
|      | Winter (DJF)       | 623 | 4.56  | 6.83  | 0.88 |
| MPTM | Pre Monsoon (MAM)  | 767 | 2.17  | 5.54  | 0.81 |
|      | Monsoon (JJA)      | 40  | 2.47  | 5.22  | 0.77 |
|      | Post Monsoon (SON) | 172 | -0.43 | 13.49 | 0.48 |
|      | Winter (DJF)       | 768 | 4.89  | 6.94  | 0.73 |



|      |                    |      |       |       |      |
|------|--------------------|------|-------|-------|------|
| GOPR | Pre Monsoon (MAM)  | 837  | -1.22 | 7.11  | 0.70 |
|      | Monsoon (JJA)      | 29   | -2.25 | 4.23  | 0.88 |
|      | Post Monsoon (SON) | 253  | 1.55  | 11.41 | 0.69 |
|      | Winter (DJF)       | 731  | 2.87  | 6.48  | 0.72 |
| DWRK | Pre Monsoon (MAM)  | 1119 | 1.42  | 7.12  | 0.62 |
|      | Monsoon (JJA)      | 377  | -0.93 | 5.47  | 0.78 |
|      | Post Monsoon (SON) | 362  | 6.09  | 8.37  | 0.87 |
|      | Winter (DJF)       | 770  | 5.54  | 7.12  | 0.82 |
| PNJM | Pre Monsoon (MAM)  | 878  | -4.75 | 10.27 | 0.60 |
|      | Monsoon (JJA)      | 46   | -0.39 | 5.76  | 0.60 |
|      | Post Monsoon (SON) | 39   | -6.10 | 18.73 | 0.20 |
|      | Winter (DJF)       | 433  | 0.79  | 5.35  | 0.64 |
| TRVM | Pre Monsoon (MAM)  | 360  | -1.85 | 6.98  | 0.75 |
|      | Monsoon (JJA)      | 53   | -7.05 | 11.36 | 0.10 |
|      | Post Monsoon (SON) | 113  | -0.32 | 10.56 | 0.42 |
|      | Winter (DJF)       | 379  | 2.87  | 6.25  | 0.82 |
| BWRN | Pre Monsoon (MAM)  | 441  | 0.39  | 5.71  | 0.80 |
|      | Monsoon (JJA)      | 12   | -5.22 | 7.37  | 0.89 |
|      | Post Monsoon (SON) | 92   | 3.56  | 8.36  | 0.79 |
|      | Winter (DJF)       | 898  | 1.94  | 5.16  | 0.82 |
| SGGN | Pre Monsoon (MAM)  | 179  | -1.23 | 3.81  | 0.79 |
|      | Monsoon (JJA)      | 33   | -3.96 | 5.49  | 0.91 |
|      | Post Monsoon (SON) | 432  | -3.24 | 5.52  | 0.87 |
|      | Winter (DJF)       | 396  | 0.72  | 2.99  | 0.91 |

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219 Table: 5 Statistical analysis of IPWV retrievals from CAMS& GNSS data (January to December  
 220 2018)

| S.No. | Station | N    | MB    | RMSE | R    |
|-------|---------|------|-------|------|------|
| 1     | ARGD    | 1624 | -2.72 | 3.69 | 0.97 |
| 2     | BHPL    | 0    | NaN   | NaN  | NaN  |
| 3     | DBGH    | 1002 | 2.91  | 6.7  | 0.95 |
| 4     | DELH    | 2345 | -1.27 | 3.09 | 0.99 |
| 5     | NGPR    | 1325 | 1.99  | 9.17 | 0.88 |
| 6     | RIPR    | 1727 | -1.94 | 3.48 | 0.98 |
| 7     | JBPR    | 1483 | -1.11 | 3.25 | 0.99 |
| 8     | PUNE    | 1165 | -6.69 | 7.62 | 0.96 |



|    |      |      |       |       |      |
|----|------|------|-------|-------|------|
| 9  | JIPR | 1483 | 0.75  | 7.19  | 0.92 |
| 10 | JPGI | 2168 | -0.68 | 3.83  | 0.98 |
| 11 | BWNR | 1240 | 7.5   | 13.59 | 0.48 |
| 12 | KRKL | 1949 | -0.9  | 3.74  | 0.96 |
| 13 | KYKM | 2145 | 0.47  | 3.33  | 0.96 |
| 14 | MPTM | 1929 | -1.3  | 3.69  | 0.97 |
| 15 | PNJM | 750  | 2.27  | 7.25  | 0.78 |
| 16 | GOPR | 1625 | -0.41 | 3.76  | 0.98 |
| 17 | DWRK | 2094 | -0.87 | 3.12  | 0.98 |
| 18 | TRVM | 2073 | -1.91 | 4.33  | 0.93 |
| 19 | SGGN | 2274 | -1.74 | 3.37  | 0.98 |

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222 Table 6. Statistical seasonal analysis of retrievals of IPWV from CAMS and GNSS data

| Station | Season             | N   | MB    | RMSE  | R    |
|---------|--------------------|-----|-------|-------|------|
| ARGD    | Pre Monsoon (MAM)  | 673 | -2.09 | 3.25  | 0.93 |
|         | Monsoon (JJA)      | 97  | -3.02 | 5.32  | 0.75 |
|         | Post Monsoon (SON) | 248 | -3.42 | 4.24  | 0.97 |
|         | Winter (DJF)       | 606 | -3.09 | 3.6   | 0.96 |
| BHPL    | Pre Monsoon (MAM)  | 0   | NaN   | NaN   | NaN  |
|         | Monsoon (JJA)      | 0   | NaN   | NaN   | NaN  |
|         | Post Monsoon (SON) | 0   | NaN   | NaN   | NaN  |
|         | Winter (DJF)       | 0   | NaN   | NaN   | NaN  |
| DBGH    | Pre Monsoon (MAM)  | 261 | 5.98  | 7.48  | 0.92 |
|         | Monsoon (JJA)      | 169 | 6.6   | 7.43  | 0.84 |
|         | Post Monsoon (SON) | 396 | 1.39  | 6.37  | 0.95 |
|         | Winter (DJF)       | 176 | -1.76 | 5.31  | 0.49 |
| DELH    | Pre Monsoon (MAM)  | 719 | -0.86 | 2.83  | 0.95 |
|         | Monsoon (JJA)      | 223 | 0.2   | 4.9   | 0.92 |
|         | Post Monsoon (SON) | 721 | -2.22 | 3.57  | 0.99 |
|         | Winter (DJF)       | 682 | -1.19 | 1.74  | 0.97 |
| NGPR    | Pre Monsoon (MAM)  | 192 | -0.53 | 2.27  | 0.94 |
|         | Monsoon (JJA)      | 211 | 1.57  | 3.53  | 0.89 |
|         | Post Monsoon (SON) | 410 | 7.23  | 16.06 | 0.5  |
|         | Winter (DJF)       | 512 | -1.09 | 2     | 0.97 |
| JBPR    | Pre Monsoon (MAM)  | 276 | 1.49  | 3.48  | 0.86 |
|         | Monsoon (JJA)      | 160 | 0.97  | 2.8   | 0.9  |
|         | Post Monsoon (SON) | 507 | -2.52 | 3.89  | 0.98 |
|         | Winter (DJF)       | 540 | -1.72 | 2.5   | 0.96 |
| JIPR    | Pre Monsoon (MAM)  | 276 | 3.67  | 8.28  | 0.16 |



|      |                    |     |       |       |      |
|------|--------------------|-----|-------|-------|------|
|      | Monsoon (JJA)      | 160 | 2.28  | 7.53  | 0.73 |
|      | Post Monsoon (SON) | 507 | -0.47 | 8.05  | 0.88 |
|      | Winter (DJF)       | 540 | -0.05 | 5.4   | 0.58 |
| JPGI | Pre Monsoon (MAM)  | 662 | 0.69  | 4.15  | 0.93 |
|      | Monsoon (JJA)      | 188 | -2.79 | 4.41  | 0.8  |
|      | Post Monsoon (SON) | 644 | -1.58 | 4.32  | 0.97 |
|      | Winter (DJF)       | 674 | -0.57 | 2.63  | 0.87 |
| PUNE | Pre Monsoon (MAM)  | 456 | -7.28 | 8.21  | 0.92 |
|      | Monsoon (JJA)      | 212 | -7.06 | 8.02  | 0.81 |
|      | Post Monsoon (SON) | 424 | -6.32 | 7.14  | 0.94 |
|      | Winter (DJF)       | 73  | -4.1  | 4.65  | 0.94 |
| RIPR | Pre Monsoon (MAM)  | 573 | -0.98 | 3.59  | 0.94 |
|      | Monsoon (JJA)      | 135 | -1.94 | 3.53  | 0.74 |
|      | Post Monsoon (SON) | 488 | -2.79 | 3.96  | 0.98 |
|      | Winter (DJF)       | 531 | -2.21 | 2.81  | 0.97 |
| KRKL | Pre Monsoon (MAM)  | 711 | -1.28 | 3.37  | 0.97 |
|      | Monsoon (JJA)      | 225 | 0.52  | 2.94  | 0.8  |
|      | Post Monsoon (SON) | 690 | -0.8  | 4.37  | 0.89 |
|      | Winter (DJF)       | 323 | -1.26 | 3.58  | 0.95 |
| KYKM | Pre Monsoon (MAM)  | 647 | 0.61  | 3.44  | 0.94 |
|      | Monsoon (JJA)      | 212 | 0.03  | 3.01  | 0.87 |
|      | Post Monsoon (SON) | 589 | 1.07  | 3.57  | 0.92 |
|      | Winter (DJF)       | 697 | -0.03 | 3.11  | 0.95 |
| MPTM | Pre Monsoon (MAM)  | 632 | -0.28 | 3.26  | 0.94 |
|      | Monsoon (JJA)      | 223 | 0.96  | 3.31  | 0.8  |
|      | Post Monsoon (SON) | 655 | -2.26 | 4.27  | 0.96 |
|      | Winter (DJF)       | 419 | -2.55 | 3.52  | 0.96 |
| DWRK | Pre Monsoon (MAM)  | 597 | -1.02 | 2.53  | 0.91 |
|      | Monsoon (JJA)      | 218 | 1.42  | 3.4   | 0.96 |
|      | Post Monsoon (SON) | 614 | -0.92 | 3.8   | 0.95 |
|      | Winter (DJF)       | 665 | -1.43 | 2.77  | 0.91 |
| GOPR | Pre Monsoon (MAM)  | 656 | -1.4  | 4.46  | 0.89 |
|      | Monsoon (JJA)      | 231 | 2.1   | 3.65  | 0.8  |
|      | Post Monsoon (SON) | 318 | 1.42  | 3.35  | 0.96 |
|      | Winter (DJF)       | 420 | -1.64 | 2.78  | 0.92 |
| PNJM | Pre Monsoon (MAM)  | 398 | 3.6   | 7.88  | 0.74 |
|      | Monsoon (JJA)      | 75  | 3.57  | 11.41 | 0.38 |
|      | Post Monsoon (SON) | 277 | 0.01  | 4.23  | 0.86 |
|      | Winter (DJF)       | 0   | NaN   | NaN   | NaN  |
| TRVM | Pre Monsoon (MAM)  | 631 | -2.26 | 4.7   | 0.9  |
|      | Monsoon (JJA)      | 199 | -0.51 | 2.3   | 0.92 |



|      |                    |     |       |      |      |
|------|--------------------|-----|-------|------|------|
|      | Post Monsoon (SON) | 617 | -1.17 | 3.85 | 0.89 |
|      | Winter (DJF)       | 626 | -2.74 | 4.84 | 0.89 |
| BWNR | Pre Monsoon (MAM)  | 644 | 13.88 | 16.5 | 0.29 |
|      | Monsoon (JJA)      | 0   | NaN   | NaN  | NaN  |
|      | Post Monsoon (SON) | 0   | NaN   | NaN  | NaN  |
|      | Winter (DJF)       | 596 | 0.6   | 9.48 | 0.16 |
| SGGN | Pre Monsoon (MAM)  | 680 | -0.85 | 2.76 | 0.93 |
|      | Monsoon (JJA)      | 192 | -0.84 | 4.57 | 0.94 |
|      | Post Monsoon (SON) | 712 | -2.51 | 4.04 | 0.97 |
|      | Winter (DJF)       | 690 | -2.05 | 2.67 | 0.95 |

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224

### 225 3. Results and discussions

226

227 The present study have two fold objectives (1) Inter-comparison of CAMS and INSAT-3DR, IPWV  
 228 retrievals with Indian GNSS stations by taking GNSS reference and (II) performance in the  
 229 retrievals CAMS and INSAT-3DR sounder for both land and ocean regions.

230

#### 231 3.1 Inter-comparison of INSAT-3DR and Indian GNSS IPWV

232 From the Figure3, The Taylor diagram to evaluate the skill characteristics of the annual distribution  
 233 of IPWV retrieved from INSAT-3DR satellite with 19 GNSS IPWV at different geographical  
 234 locations (Figure 2) over Indian subcontinent during the period of 1 January 2017 to 30 June 2018.  
 235 Further tailor diagram displaying three statically skill metrics: distribution of the correlation  
 236 coefficient, root mean square error (RMSE) and standard deviation. If an IPWV performs nearly  
 237 perfect, its position in the diagram is expected to be very close to the observed point (Figure3). An  
 238 attempt have been made to evaluate the IPWV retrieved from INSAT-3DR satellite with GNSS  
 239 observations show the root mean square error (RMSE) of 8 inland stations out of 10 stations lies  
 240 between 4 to 6 mm except 8 mm and 12 mm for Jalpaiguri (JPGI) and Dibrugarh (DBGH) stations  
 241 respectively. The value of Correlation Coefficient (CC) and bias for inland stations lie in the range  
 242 (0.72 to 0.93) & (-3.0 mm to +3.0 mm) respectively. Similarly, for all the coastal stations the value  
 243 of CC and bias lie in the range (0.67 to 0.88) & (-3.0 mm to +3.0 mm) respectively. RMSE for 7  
 244 coastal stations out of 8 stations lie between 5 to 7 mm except 9 mm of Panjim. The value of CC  
 245 and bias and RMSE for desert station (SGGN) 0.88, -1.4 mm and 4.42 mm respectively (Table 3).

246 The correlation coefficient of IPWV varies from 0.60 to 0.89 of all the stations for the pre monsoon  
 247 season. IPWV retrieved from INSAT-3DR satellite with respect to GNSS IPWV are having the  
 248 negative biases ranges (-6.7 mm to -0.39mm) which are indicating underestimation of IPWV at  
 249 the stations of ARGD, DBGH, DELH, NGPR, JIPR, JPGI, RIPR, GOPR, PNJM, TRVM &  
 250 SGGN. The stations JBPR, PUNE, KRKL, KYKM, MPTM, DWRK, and BWNR are having the  
 251 positive biases ranges (0.03 to 2.54 mm) which are indicating overestimation of IPWV by INSAT-  
 252 3DR during pre-monsoon season. RMSE ranges between 3.5mm to 10mm (Table 4).



253 The correlation coefficient of IPWV varies from 0.60 to 0.90 of all the stations during monsoon  
254 season except TRVM (0.1), KYKM (0.31) and KRKL (0.15) respectively. The stations ARGD,  
255 DBGH, DELH, JBPR, JIPR, JPGI, PUNE, KRKL, KYKM, GOPR, BWNR, PNJM, TRVM and  
256 SGGN are having the negative biases ranges (-0.39mm to -12.39 mm) which are indicating the  
257 underestimation of IPWV by INSAT-3DR as compared to MPTM, NGPR & BHPL are having the  
258 positive biases ranges of (0.39mm to 2.47mm) during monsoon season. RMSE ranges of 4.23mm  
259 to 14.71mm (Table 4).

260 The correlation coefficient of IPWV varies from 0.60 to 0.98 of all the stations during post  
261 monsoon season except TRVM (0.42), PNJM (0.2), MPTM (0.48), KYKM (0.50) and DBGH (-  
262 0.28) respectively. The stations DBGH, DELH, KRKL, MPTM, PNJM, TRVM and SGGN are  
263 having the negative biases ranges (-0.32mm to -6.10mm) except DBGH (-22.52mm) which are  
264 indicating the underestimation of IPWV by INSAT-3DR as compared to ARGD, BHPL, NGPR,  
265 JBPR, JIPR, JPGI, PUNE, RIPR, KYKM, GOPR, DWRK, BWNR are having the positive biases  
266 ranges of (0.88mm to 9.43mm) during post-monsoon season. RMSE ranges of 3.94mm to  
267 13.49mm except PNJM (18.73mm) & DBGH (27.74mm) respectively (Table 4).

268 The correlation coefficient of IPWV varies from 0.64 to 0.95 of all the stations during winter  
269 season except DBGH (0.48), JPGI (0.50) respectively. The stations BHPL, DBGH NGPR, JBPR,  
270 JIPR, JPGI, PUNE, RIPR, KRKL, KYKM, MPTM, GOPR, DWRK, PNJM, TRVM, BWNR &  
271 SGGN are having the positive biases ranges (0.61mm to 5.90) which are indicating the  
272 overestimation of IPWV by INSAT-3DR as compared to ARGD (-0.84mm) & DELH (-1.51mm)  
273 during winter season. RMSE ranges of 2.99mm to 8.53mm (Table 4).

274 Scatter plot of hourly INSAT-3DR IPWV and GNSS IPWV plotted in Figure 4 using hexagonal  
275 binning. The number of occurrences in each bin is colour-coded (not on a linear scale). It is now  
276 possible to see where most of the data lie and a better indication of the relationship between GNSS  
277 IPWV and INSAT-3DR IPWV are revealed.

278 ARGD station is located at leeward or eastern side of Western Ghats. During post monsoon season  
279 convective type thunderstorm are common and main source of precipitation and increase in IPWV.  
280 Delhi has humid subtropical type of climate and affected by deferent type of weather system like:  
281 Western Disturbances (WDs), induced cyclonic circulations, advection of moisture from Arabian  
282 Sea and Bay of Bengal during intense cyclonic activities convective activities in pre –monsoon  
283 season throughout the year in various proportions.

284 Stations TRVM, KYKM, KRKL, PNJM, MPTM, JPGI and DBGH are poorly correlated (INSAT-  
285 3DR vs. GNSS) averaging of INSAT-3DR pixels in gridded data contains both sea and  
286 mountainous land together along with topographically diverse terrains around these stations.  
287 Similar behavior is also seen in annual analysis of IPWV in coastal stations with the above said  
288 reasons.



289 It is seen that discrepancies arise because the wet mapping functions that used to map the wet delay  
290 at any angle to the zenith do not represent the localized atmospheric condition particularly for  
291 narrow towering thunder clouds and non-availability of GPS satellites in the zenith direction  
292 (Puviarasan et al., 2020).

293 Large or small bias between IPWV retrieved from INSAT-3DR and GNSS exists due to  
294 limitations of the INSAT-3DR retrievals and calibration uncertainties in the radiance measured by  
295 INSAT-3DR. Another possibility of operation differences in IPWV measurements adopted in  
296 GNSS /INSAT-3DR in respect to mapping functions /weighting functions.

297 The results indicate that the RMSE values increase significantly under the wet conditions (Pre  
298 Monsoon & Monsoon season) than under dry conditions (Post Monsoon & winter season) (Table  
299 4). The study showed differences in the magnitude and sign of bias of INSAT-3DR with respect to  
300 GNSS IPWV from station to station and season to season.

### 301 **3.2 Inter-comparison of CAMS reanalysis and Indian GNSS IPWV**

302  
303 From the Figure 5, the Taylor diagram evaluates the skill characteristics in terms of RMSE,  
304 Correlation Coefficient and Standard Deviation of the annual distribution of IPWV retrieved from  
305 CAMS with 19 GNSS IPWV at different geographical locations (Figure 5) over Indian  
306 subcontinent during the period of 1 January 2018 to 31 December 2018. The root mean square  
307 error (RMSE) between CAMS reanalysis & GNSS data retrievals of 9 inland stations out of 10  
308 stations lies between 3 to 7 mm except 9 mm for Nagpur (NGPR) station respectively. The value  
309 of Correlation Coefficient (CC) and bias for inland stations lie in the range (0.88 to 0.99) & (-3.0  
310 mm to +3.0 mm, except Pune, -6.69 mm) respectively (Table 5).

311 Root Mean Square Error (RMSE) for 7 coastal stations out of 8 stations lie between 3 to 7 mm  
312 except 14.0 mm of Bhubaneswar (BWNR). The value of CC and bias lie in the range (0.78 to 0.98  
313 except 0.48 BWNR) & (-2.0 mm to +2.0 mm except +7.5 mm at BWNR) respectively. The value  
314 of CC and bias for desert station (SGGN) 0.88 and -1.4 mm respectively. The desert station RMSE,  
315 CC & Bias are 3.37 mm, 0.98 and -1.74 mm respectively (Table 5).

316 The correlation coefficient of IPWV varies from 0.74 to 0.97 of all the stations except JIPR  
317 (0.16) & BWNR (0.29) for the pre monsoon season. IPWV retrieved from CAMS reanalysis with  
318 respect to GNSS IPWV are having the negative biases ranges (-7.28 mm to -0.28 mm) which are  
319 indicating underestimation of IPWV at the stations of ARGD, DELH, NGPR, PUNE, RIPR,  
320 KRKL, MPTM, DWRK, GOPR, TRVM, SGGN. The stations DBGH, JBPR, JIPR, JPGI, KYKM,  
321 PNJM and BWNR are having the positive biases ranges (0.61 mm to 13.88 mm) which are  
322 indicating overestimation of IPWV by CAMS during pre-monsoon season. RMSE ranges between  
323 2.27 mm to 8.28 mm except BWNR (16.50 mm) (Table 6).

324 The correlation coefficient of IPWV varies from 0.73 to 0.96 of all the stations during  
325 monsoon season except PNJM (0.38) respectively. The stations ARJD, JPGI, PUNE, RIPR,



326 TRVM and SGGN are having the negative biases ranges (-0.51mm to -7.28 mm) which are  
327 indicating the underestimation of IPWV by CAMS reanalysis as compared to DBGH, DELH,  
328 NGPR, JBPR, JIPR, KRKL, KYKM, MPTM, DWRK, GOPR & PNJM are having the positive  
329 biases ranges of (0.03mm to 6.60mm) during monsoon season. RMSE ranges of 2.30mm to  
330 11.41mm. Data are not available at the stations of BHPL & BWRN (Table 6).

331 The correlation coefficient of IPWV varies from 0.86 to 0.99 of all the stations during post  
332 monsoon season except NGPR (0.50) respectively. The stations ARJD, DELH, JBPR, JIPR, JPGI,  
333 PUNE, RIPR, KRKL, MPTM, DWRK, TRVM, SGGN are having the negative biases ranges (-  
334 0.47mm to -6.320mm) which are indicating the underestimation of IPWV by CAMS reanalysis as  
335 compared to DBGH, NGPR, KYKM, GOPR, PNJM are having the positive biases ranges of  
336 (0.01mm to 7.23mm) during post-monsoon season. RMSE ranges of 3.35mm to 8.05mm except  
337 NGPR (16.06mm) respectively (Table 6). During this transition time most parts of the Indian  
338 region remain gradually dry and decrease in water content as compared to the North East and  
339 Southern parts of India. It has been observed in this analysis during post-monsoon season, stations  
340 located in dry/wet regions of India CAMS data under/over estimates with respect to GNSS.

341 The correlation coefficient of IPWV varies from 0.87 to 0.97 of all the stations during  
342 winter season except DBGH (0.49) JIPR (0.58) & BWRN (0.16) respectively. The stations ARJD,  
343 DBGH, DELH, NGPR, JBPR, JIPR, JPGI, PUNE, RIPR, KRKL, KYKM, MPTM, DWRK,  
344 GOPR, TRVM, SGGN are having the negative biases ranges (-0.03mm to -4.10mm) which are  
345 indicating the underestimation of IPWV by CAMS reanalysis as compared to BWRN are having  
346 the positive biases of (0.60mm) during winter season. RMSE ranges of 1.74mm to 9.48mm  
347 respectively (Table 6).

348 During winter season over Indian region, local effects which play an important role moisture  
349 development are suppressed from their importance due to sparse observation network data and  
350 optimization of random and systematic errors which is further utilized for effective improvement  
351 in model predictions.

352 CAMS data used in this study have consistency and homogenous spatial with reduced bias  
353 and better performance of model physics and dynamics due to assimilation of new data sets. But  
354 over Indian domain during pre-monsoon season land stations is mainly affected by local  
355 convective developments of shorter time scale of few hours which is not captured by the CAMS  
356 data and a dry bias prevails in most of the stations mentioned above.

357 Large scale features of moisture flow are generally captured in CAMS data except localized  
358 features due to sparseness or very few numbers of the quality controlled both ground as well as  
359 satellite data sets assimilated in the CAMS data over Indian region. Very few GNSS data is  
360 assimilated for Indian region in the latest CAMS Data sets. During monsoon season 6 stations  
361 mentioned above are underestimating IPWV with CAMS data due to complex and rugged  
362 topographic terrains which is not well captured in CAMS data due to very few observations are



363 available in these locations. In almost all other stations IPWV values are overestimated as the  
364 global features of monsoon flow are well captured by the CAMS data. The similar findings (over  
365 estimate or underestimate) are also observed with GNSS data for above mentioned stations except  
366 PNJM and BWNR where the meteorological sensor get replaced 2 to 3 times during the year of  
367 2018.

### 368 **3.3 Inter-comparison of CAMS reanalysis and INSAT-3DR IPWV**

369 The correlation coefficient (CC) computed between INSAT-3DR and CAMS reanalysis, IPWV  
370 retrievals are negative correlated almost entire land area, except pockets of Indo Gangetic Plain  
371 (IGP) of Indian region for winter months. The computed value of CC lies within the range 0.2 to  
372 -0.5 in the land area. Over Ocean retrievals the values of CC are slightly positive side (0.0 to 0.5)  
373 in entire area of Bay of Bengal and Arabian Sea except off shore area on both east and west side  
374 in winter months (Figure 6). This poor resemblance between the results (INSAT-3DR and CAMS)  
375 may be due to the interpolated values of coarser resolution CAMS data. INSAT-3DR satellite based  
376 data have diverse, covariant information content, different temporal coverage and have smaller  
377 ability with respect to representative observations in CAMS.

378 In pre-monsoon season the value of CC between INSAT-3DR and CAMS reanalysis retrievals are  
379 positive (0.0 to 0.6) over Oceanic entire areas of Bay of Bengal and Arabian Sea except few  
380 patches in Arabian Sea. Over land the values are slightly positive (0.0 to 0.2) in many areas and  
381 slightly negative (0.0 to -0.3) for pockets of North West and Central India region (Figure 6).

382 During monsoon month the value of CC is over land area are mostly positively correlated (0.0 to  
383 0.7) except the belt of monsoon trough and south India which have shown appreciably low value  
384 of CC (-0.3 to -0.5). This might be due to the presence of clouds on both side of monsoon trough  
385 and southern belt of India during monsoon season. (Figure 6).

386 In post monsoon season months the value of CC between INSAT-3DR and CAMS reanalysis  
387 retrievals are positive (0.0 to 0.7) for both land and oceanic areas almost entirely except some areas  
388 of North of Bay and Bengal and South East Arabian Sea (Figure 6).

389 The differences in the magnitude and sign of CC of INSAT-3DR with respect to CAMS reanalysis  
390 IPWV due to lack of quality controlled data, limitations of the instrument and collocations in  
391 matchup data sets.

392 Seasonal bias between CAMS reanalysis and INSAT-3DR (CAMS-INSAT) retrievals is higher  
393 (positive) in monsoon and pre-monsoon months than in winter and post monsoon months for both  
394 land and oceanic areas. It has been observed from the analysis (Figure 7) that CAMS data over  
395 estimate as compared to INSAT-3DR IPWV at both land and ocean during pre-monsoon and  
396 monsoon season. The same is underestimate during winter and post monsoon season (Figure 7).



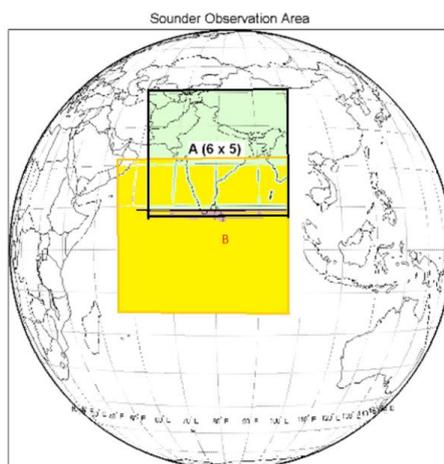
397 Seasonal RMSE between CAMS reanalysis and INSAT-3DR (CAMS-INSAT) retrievals are  
398 higher (>15 mm) over Bay of Bengal and pockets of Indo Gangetic Plains (IGP), North East (NE)  
399 India, Southern Parts of India, North Indian Ocean and Arabian Sea during pre-monsoon,  
400 monsoon, post monsoon season and (< 15 mm) during winter season. Higher values of RMSE  
401 prevails over the regions of higher moisture availability or water content in the Atmosphere.  
402 (Figure 8).

### 403 **3.4 Distribution and Variability of IPWV retrieved from INSAT03DR and CAMS reanalysis**

404 The annual mean value and standard deviation of both the retrievals INSAT -3DR sounder and  
405 CAMS reanalysis data sets are presented in Figure 9. The standard deviations of CAMS reanalysis  
406 retrievals data set are appreciably high (0.0 to 14 mm) in both land and ocean areas as compared  
407 to INSAT-3DR retrievals. This variation of higher spread from mean values is may be due to the  
408 drier bias present in the CAMS reanalysis data sets (Inness et al, 2019) with coarser resolution as  
409 compared to INSAT-3DR retrievals.

410 The mean IPWV values vary in the range of 0–50mm depending upon the region and prevailing  
411 weather system affected throughout the year. Larger mean IPWVs occur in the coastal regions of  
412 Indian Ocean regions compare to inland and desert regions due to warm air condition as compared  
413 to inland and ocean. The south foothill of Himalayas has the largest PWV variation with a SD ~16  
414 mm (Figure 9). This is attributed to the monsoon season that results in large changes in  
415 precipitation at different seasons in these regions. The seasonal distribution of mean IPWV and  
416 standard deviation of CAMS and INSAT-3DR for monsoon and post monsoon increased in CAMS  
417 data as compared to INSAT -3DR retrievals due to wet bias present in the CAMS data sets (Figure  
418 10).

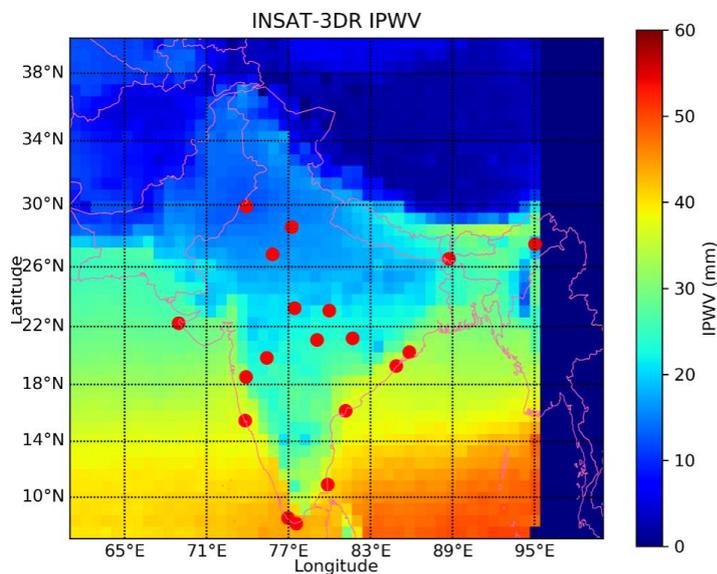
419 Standard deviation (SD) between CAMS reanalysis and Indian GNSS retrievals is more dispersed  
420 from their mean values. The Standard deviations values are higher over ocean as compared to land  
421 areas in every season except post monsoon season (Figure 10).



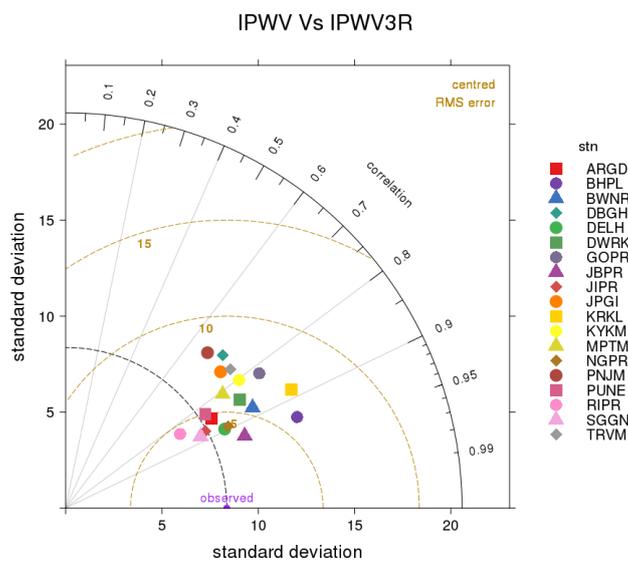
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423 Sector-A Sector-B  
424 0300, 0400, 0500 UTC-INSAT-3DR 0000, 0130 UTC INSAT-3DR  
425 Figure 1. Scan Strategy and Area of Coverage of INSAT-3DR Sounder payload.



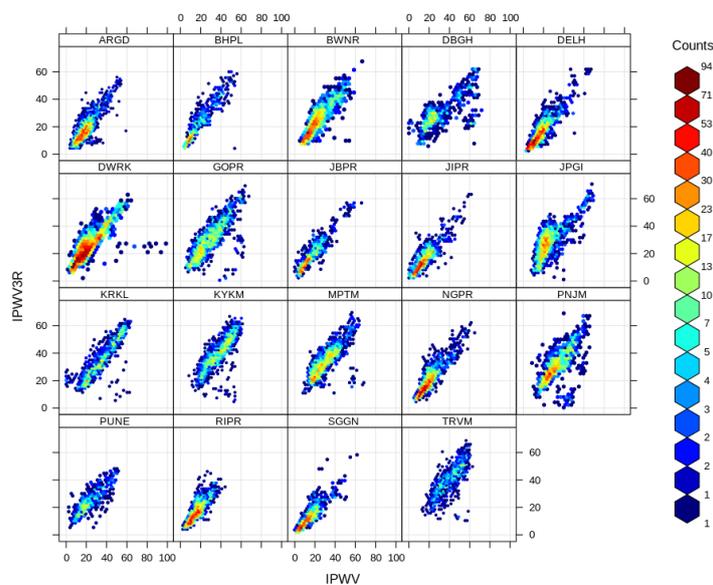
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427 Figure 2. The annual mean of IPWV over India retrieved from INSAT- 3DR during the year of  
428 2018.The geographical distribution of 19 GNSS stations (filled Red color circles).  
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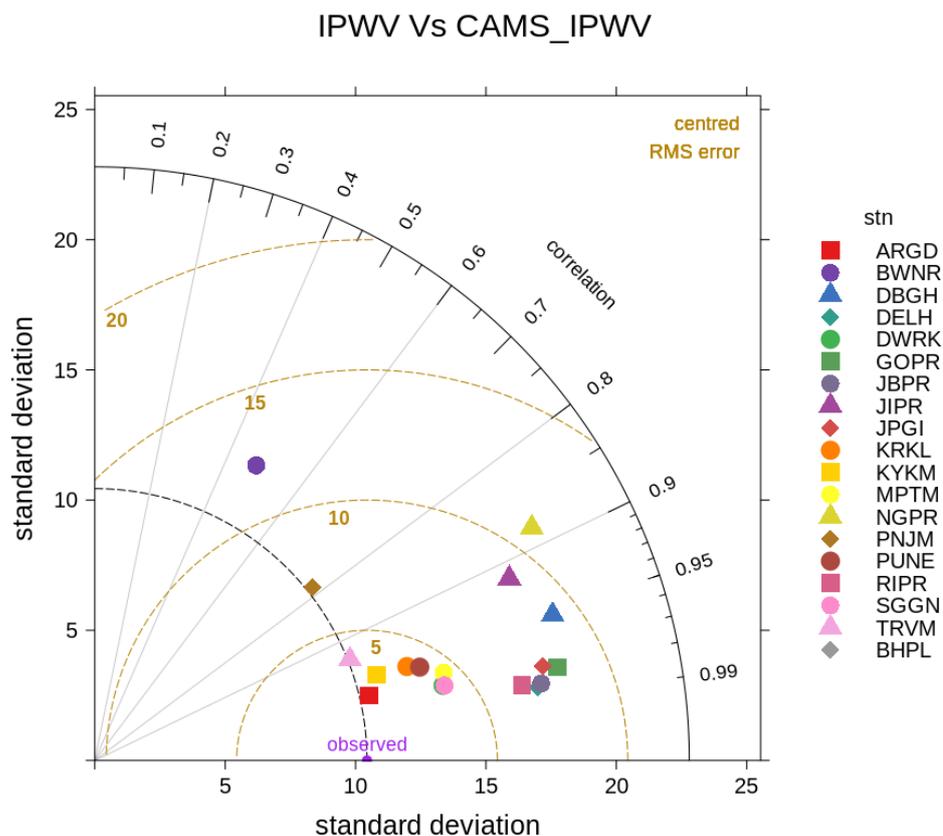
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Figure 3: Taylor diagram of INSAT-3DR Vs Indian GNSS retrievals.



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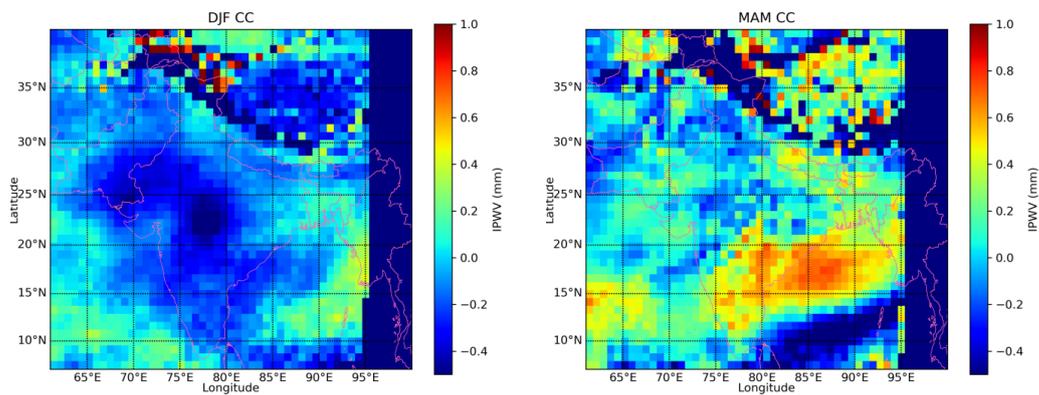
433 Figure 4. Scatter plot of hourly INSAT-3DR IPWV vs GNSS IPWV using hexagonal binning.



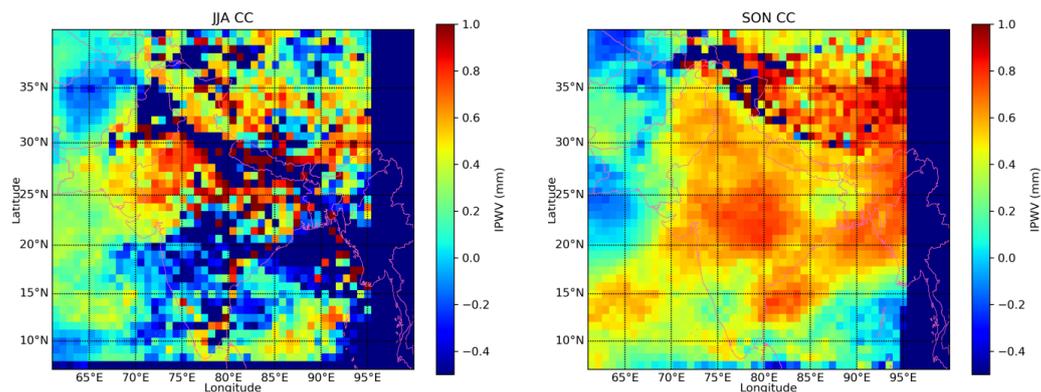
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435 Figure 5. Taylor diagram of CAMS vs Indian GNSS retrievals

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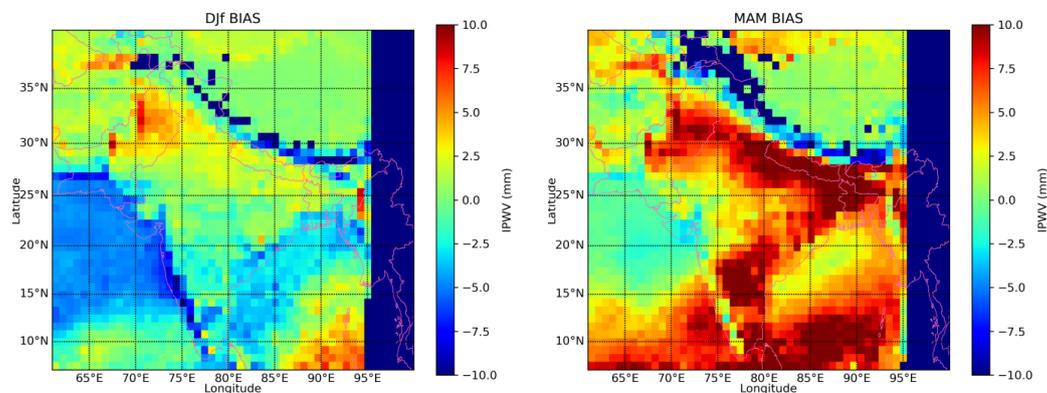
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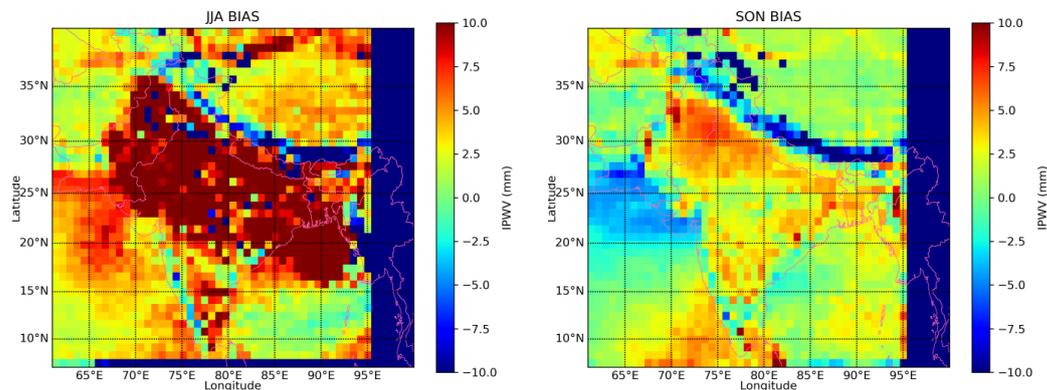
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439 Figure 6. Seasonal Correlation Coefficient of CAMS and INSAT-3DR data

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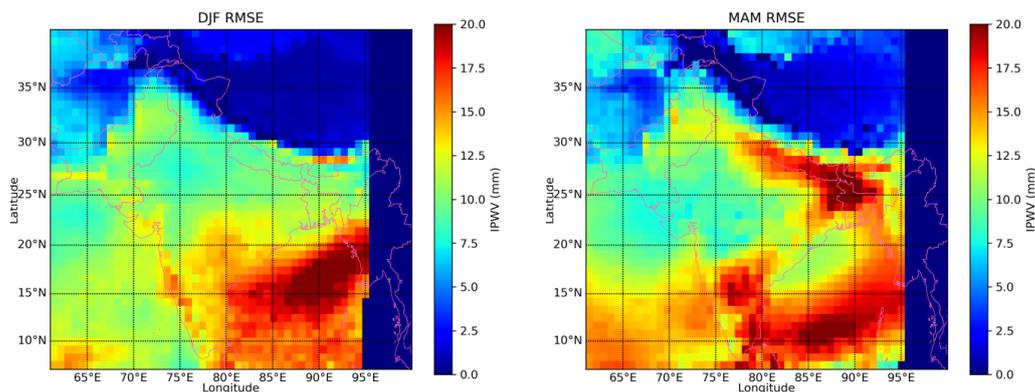
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443 Figure 7. Seasonal bias of IPWV between CAMS and INSAT-3DR

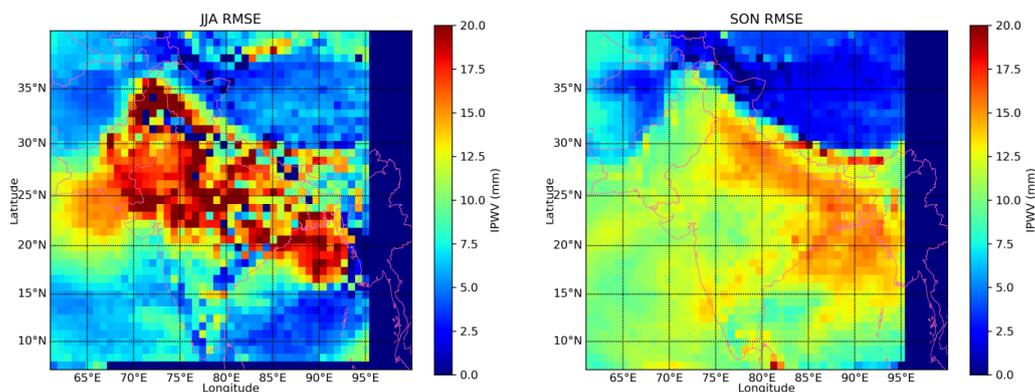
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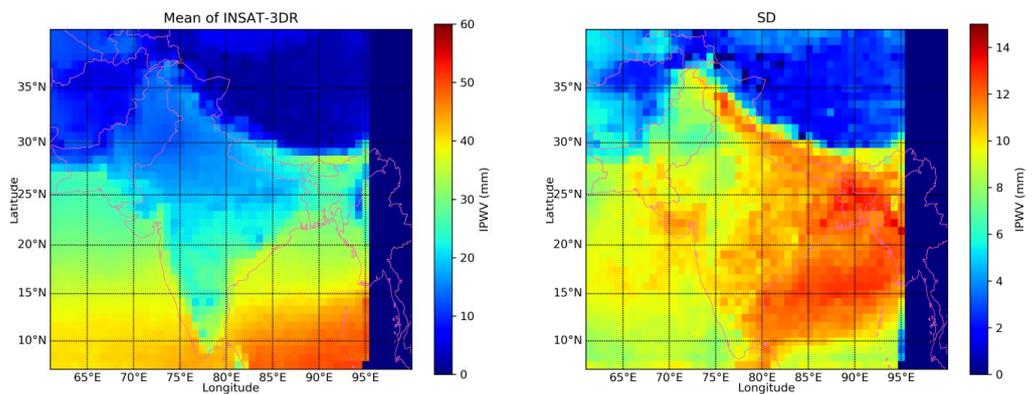


447 Figure 8. Seasonal RMSE between CAMS and INSAT-3DR

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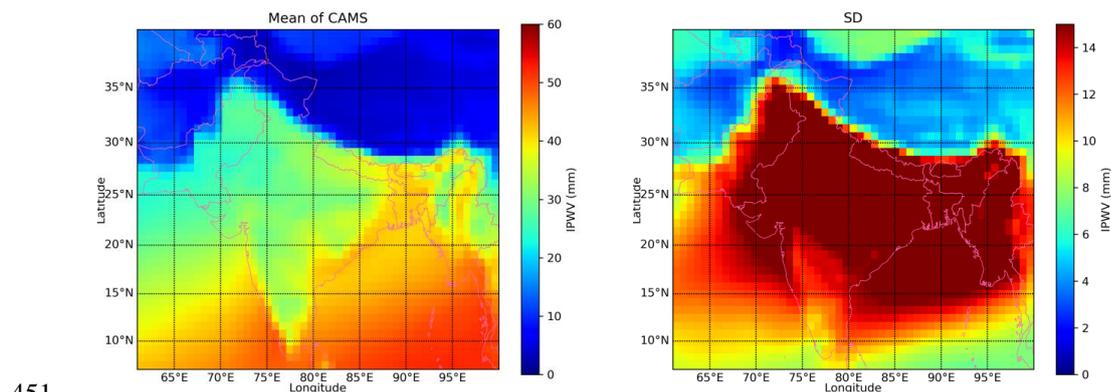
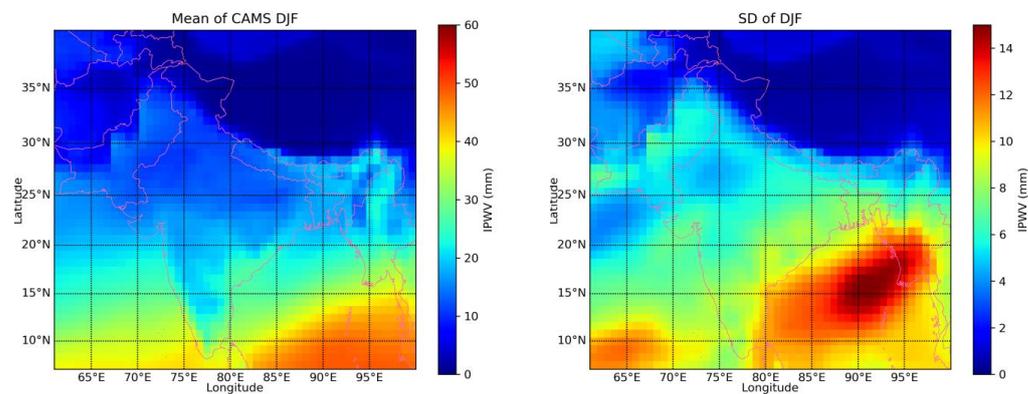
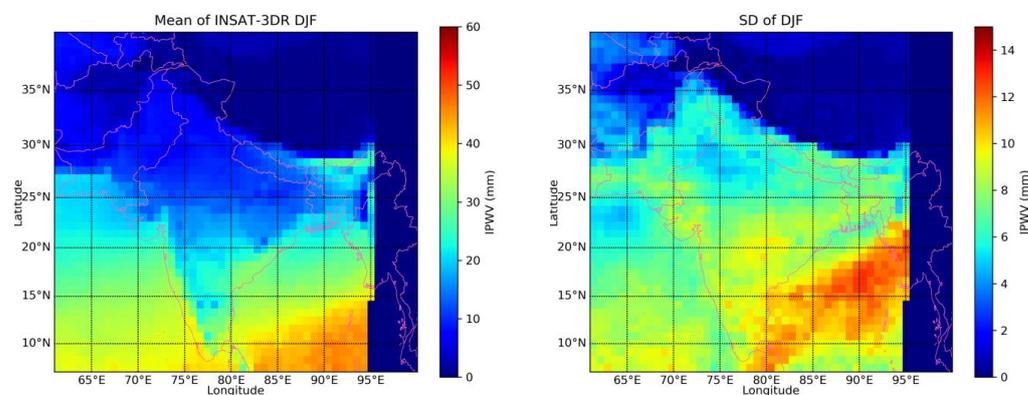


Figure 9. Means and SD of INSAT-3DR and CAMS IPWV for the year 2018

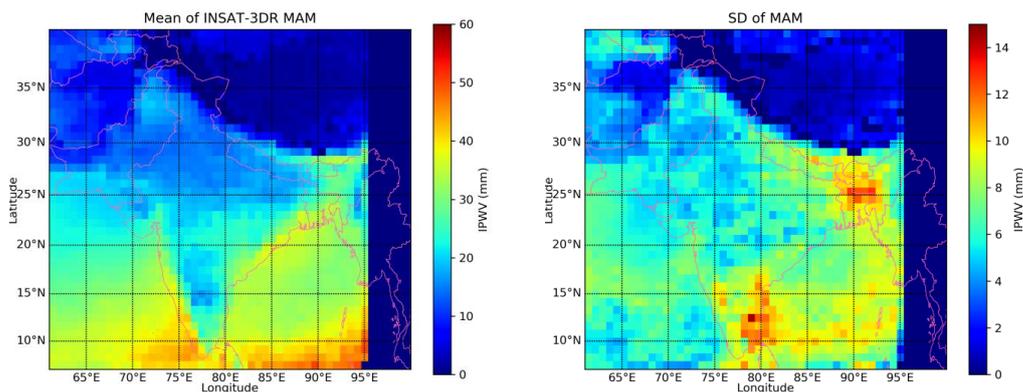
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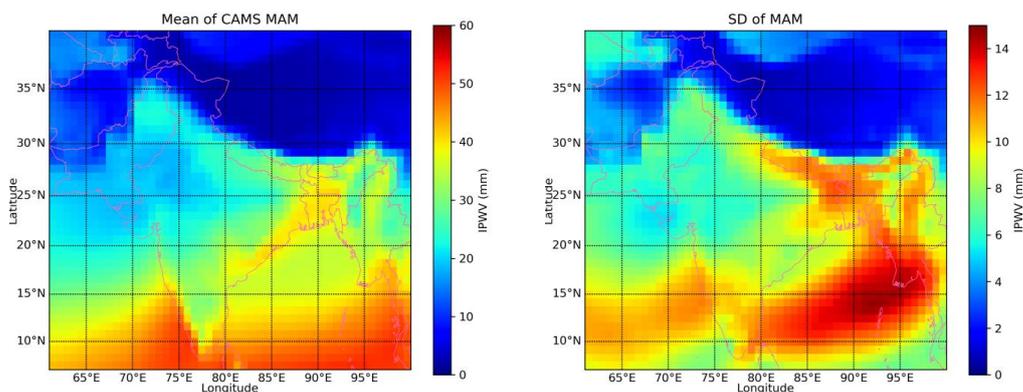
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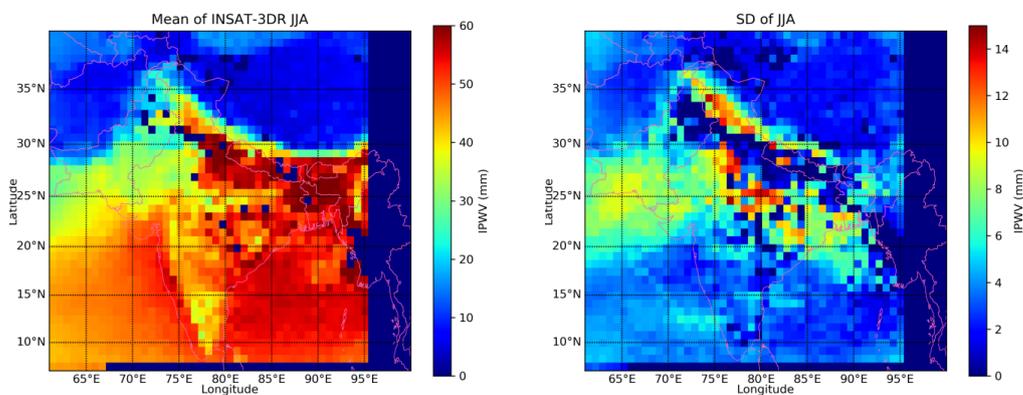
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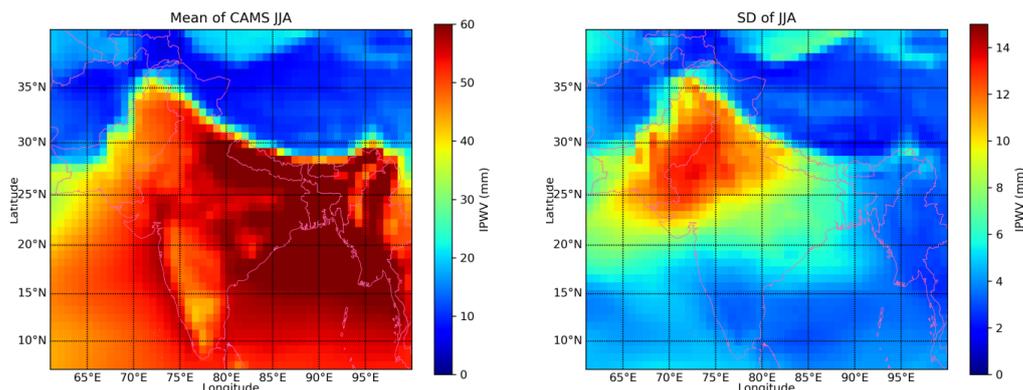


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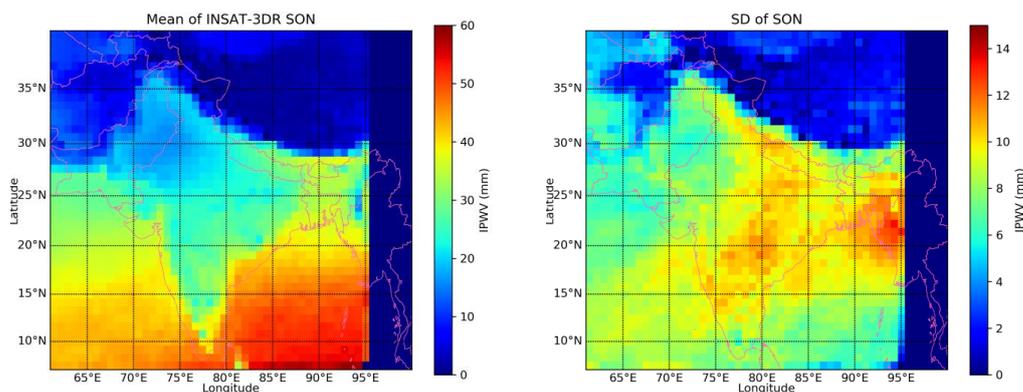




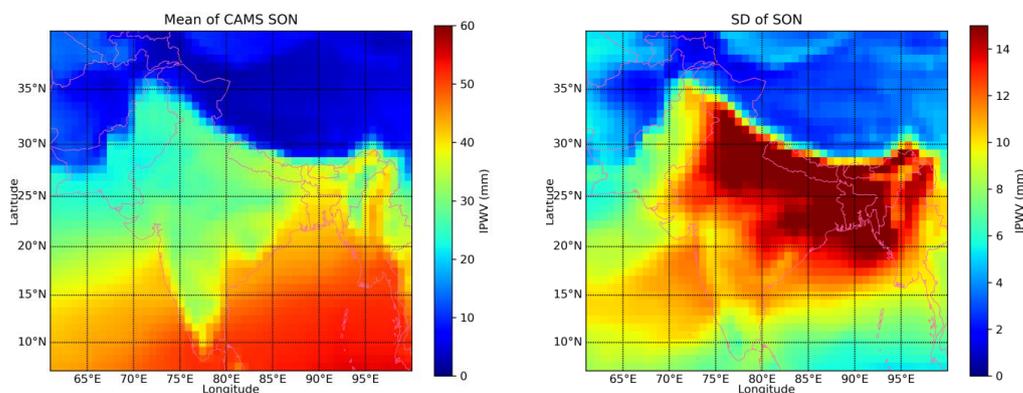
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462 Figure 10. Seasonal Means and SDs of INSAT-3DR and CAMS retrieved IPWV for the year  
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#### 4. Conclusions

1. It is noticed that seasonal correlation coefficient (CC) values between INSAT-3DR and Indian GNSS data mainly lie within the range of 0.50 to 0.98 for all the selected 19 stations except Thiruvananthapuram (0.1), Kanyakumari (0.31), Karaikal (0.15) during monsoon and Panjim (0.2) during post monsoon season respectively. The seasonal CC values between CAMS and INSAT-3DR IPWV are ranges 0.73 to .99 except Jaipur (0.16) & Bhubneshwar (0.29) during pre-monsoon season, Panjim (0.38) during monsoon, Nagpur (0.50) during post-monsoon and Dibrugarh (0.49) Jaipur (0.58) & Bhubneshwar (0.16) during winter season respectively.
2. The RMSE values increases significantly under the wet conditions (Pre Monsoon & Monsoon season) than under dry conditions (Post Monsoon & winter season) and the differences in magnitude and sign of bias of INSAT-3DR, CAMS with respect to GNSS IPWV from station to station and season to season.
3. Large scale features of moisture flow are generally captured in CAMS reanalysis data except localized features due to sparseness or very few numbers of the quality controlled both ground as well as satellite data sets assimilated in the CAMS data over Indian region.
4. Large or small bias between IPWV retrieved from INSAT-3DR and GNSS exists due to limitations of the INSAT-3DR retrievals and calibration uncertainties in the radiance measured by INSAT-3DR. The accuracy of the data sets is affected by the operation differences in IPWV measurements adopted in GNSS /INSAT-3DR in respect to mapping functions /weighting functions.
5. The differences in the magnitude and sign of CC of INSAT-3DR with respect to CAMS reanalysis IPWV due to lack of quality controlled data, limitations of the instrument and collocations in matchup data sets.
6. Seasonal bias between CAMS reanalysis and INSAT-3DR (CAMS-INSAT) retrievals is higher (positive) in monsoon and pre-monsoon months than in winter and post monsoon months for both land and oceanic areas. It is also seen that CAMS data over estimate as compared to INSAT-3DR IPWV at both land and ocean during pre-monsoon and monsoon season. The same is underestimate during winter and post monsoon season.
7. Seasonal RMSE between CAMS reanalysis and INSAT-3DR (CAMS-INSAT) retrievals are higher (>15 mm) over Bay of Bengal and pockets of Indo Gangetic Plains (IGP), North East (NE) India, Southern Parts of India, North Indian Ocean and Arabian Sea during pre-monsoon, monsoon, post monsoon season and (< 15 mm) during winter season. Higher values of RMSE prevails over the regions of higher moisture availability or water content in the Atmosphere.
8. The mean IPWV values vary in the range of 0–50 mm depending upon the region and prevailing weather system affected throughout the year. Larger mean IPWVs occur in the coastal regions of Indian Ocean regions compare to inland and desert regions due to warm air condition as compared to inland and ocean. The south foothill of Himalayas has the largest PWV variation with a SD ~16 mm.



507 This study will help to improve understanding regarding representation of uncertainties associated  
508 with land, coastal and desert locations in term of seasonal flow of IPWV which is an essential  
509 integrated variable in forecasting applications.

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512 (<https://ads.atmosphere.copernicus.eu>) link for providing the data for the above study.

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