Article

Attenuation Correction for Ka-band Cloud Radar Using X-band Weather Radar Data

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Abstract: In order to correct attenuated millimeter-wavelength (Ka-band) radar data and address the problem of instability, an attenuation correction methodology (attenuation correction with variation trend constraint; VTC) was developed. Using synchronous observation conditions and multi-band radars, the VTC method adopts the variation trends of reflectivity in X-band radar data captured with wavelet transform as а constraint to adjust reflectivity factors of millimeter-wavelength radar. The correction was evaluated by comparing reflectivities obtained by millimeter-wavelength cloud radar and X-band weather radar. Experiments showed that attenuation was a major contributory factor in the different reflectivities of the two radars when relatively intense echoes exist, and the attenuation correction developed in this study significantly improved data quality for millimeter-wavelength radar. Reflectivity differences between the two radars were reduced and reflectivity correlations were enhanced. Errors caused by attenuation were eliminated, while variation details in the reflectivity factors were retained. The VTC method is superior to the bin-by-bin method in terms of correction amplitude and can be used for attenuation correction of shorter wavelength radar assisted by longer wavelength radar data.

Keywords: millimeter-wavelength cloud radar; attenuation correction; dual-radar; data fusion

1. Introduction

The role of clouds in Earth-atmosphere radiation transmission and balance is an important factor that affects climate change [1]. Furthermore, it is also a key factor for weather forecasting and for performing artificial weather modification. Therefore, the observation and analysis of macro and micro cloud parameters is important. Compared with centimeter-wavelength radar, millimeter-wavelength cloud radar (MMCR) has higher sensitivity, a larger dynamic range, smaller antenna size, lower transmitted peak power, and finer temporal-spatial resolution; thus, MMCR represents an effective means for cloud observation [e.g., 2, 3]. MMCR bridges an observational gap in Earth's hydrological cycle by adequately detecting clouds and precipitation [4], and has been employed by a number of studies [e.g., 5–11]. However, the data from MMCR working at 35 GHz (Ka-band) and 94 GHz (W-band) are usually significantly more attenuated than centimeter-wavelength radar data [3]. The intensities and areas of echoes are degraded and clouds or precipitation behind intense echoes cannot be detected. Attenuation errors in raw data are transferred into sequential quantitative productions; therefore, it is vital to analyze and correct attenuation errors in order to allow for further quantitative applications.

Lhermitte [3] studied the attenuation and scattering of millimeter-wavelength radiation by clouds and precipitation. So far, most of the available attenuation correction methods are modified from those used with centimeter-wavelength radar. For conventional radar, empirical relationships between specific attenuation (A_{H}) and the radar reflectivity factor (Z_{H}) have been adopted for the correction of reflectivity [12, 13]; however, because A_H is calculated according to measured (or attenuated) rather than intrinsic (or unattenuated) Z_{H} , methods of this kind are inherently unstable [13] and can lead to over-correction or insufficient correction. In order to address this problem, numerous constraints on the attenuation correction procedure have been considered. Surface reference technology (SRT) [e.g., 14, 15] obtains path-integrated attenuation (PIA) by calculating the differences between the reflectivities of precipitation and reference echoes (e.g., mountain echo under clear sky conditions), while dual-wavelength methods obtain PIA by comparing the reflectivities of radars at different wavelengths [15, 16]. Seto [17] modified the $A_H - Z_H$ relationship by using the dual-frequency ratio (DFR) of Z_H and SRT for dual-frequency precipitation radar (DPR) on the core satellite of the Global Precipitation Measurement (GPM) mission. However, the accuracy of these methods is significantly influenced by the reflectivity accuracy of the reference echo.

For dual-polarized radar, PIA can be estimated using the total differential propagation phase (ϕ_{DP}) based on the approximate linear relationship between A_H and the specific differential phase (K_{DP}) [e.g., 18-20]; the proportionality factor between A_H and K_{DP} is very sensitive to temperature, drop size distribution (DSD), and drop shape variations [18, 21]. Finally, the self-consistent method with constraints was devised to estimate the optimal $A_H - K_{DP}$ relationship [22, 23]. However, K_{DP} can be heavily polluted by noise, in particular light rainfall [e.g., 23-25], and so for MMCR whose main targets are clouds and light rainfall, correction methods based on K_{DP} may introduce significant additional error.

The existing correction methods described above rely on the radar itself and have numerous defects. As an alternative, attenuation correction methods assisted by other radars or instruments have been developed. Stereoradar methods were developed to retrieve reflectivity by using the data from two radars [26]. Radiometer measurements have been introduced into the correction of radar reflectivity [27]. PIA obtained by microwave link has also been used [e.g., 28–31]. In networked radar environments, reflectivity and specific attenuation along each

beam have been obtained by combined backscatter and forward scatter equations of the precipitation medium with constraints on PIA [32].

With the current level of development for meteorological radar, it is becoming more common for multiple cloud and precipitation observation radars to be working concurrently, using the same or different wavelengths and covering overlapping observation areas. This situation is especially common in countries and regions where centimeter-wavelength weather radar networks have been established and mosaic productions of network-wide radars are available (e.g., China, Europe, the United States).

In this study, a new method for reducing the error introduced by attenuation of MMCR data was developed. The attenuation correction with variation trend constraint (VTC) method compensates for the reflectivities of MMCR by using the variation trend of reflectivities in X-band weather radar (XR) as a constraint. Analyzed radar data showed that the VTC method can effectively reduce attenuation errors in the reflectivities of MMCR, while also addressing instability problems and maintaining variation details.

2. Materials and Methods

2.1 Evaluating attenuation impact on MMCR reflectivity

Attenuation originates from absorption and scattering. For MMCR, attenuation mainly includes two parts: atmospheric absorption due to oxygen and water vapor, and attenuation due to liquid water [3]. Atmospheric absorption can be calculated according to the Stepanenko absorption model [33]. Since MMCR usually works at the Ka-band (35 GHz) and W-band (95 GHz), both of which are atmospheric windows, attenuation due to atmospheric absorption is negligible and can be ignored; therefore, only attenuation caused by water vapor in clouds needs to be considered.

To analyze the impacts of attenuation on the reflectivity of MMCR, with an aim to optimize and evaluate an attenuation correction methodology, a comparative analysis of reflectivities was conducted. Radar data were collected from two radars (Table 1): a Ka-band ground-based MMCR and an XR used for weather surveillance. These radars were working synchronously in the World Meteorological Organization (WMO) 8th radiosondes inter-comparison and integrated remote instruments experiment, conducted in July 2010 in Guangzhou Province, China.

Ta	Table1. Main characteristics of the MMCR and XR ^a							
Parameter	Wavelength	Gate	Antenna	Range	Peak			
Radar	/cm	width	beam	/km	power			
		/m	width /°		/w			
MMCR	0.86	50	0.4	30	699			
XR	3.2	62.5	0.99	62.5	56975			

a. Millimeter-wavelength cloud radar (MMCR) and X-band weather radar of the World Meteorological Organization (WMO) 8th radiosondes inter-comparison and integrated remote instruments experiment (July 2010, Guangzhou Province, China)

The MMCR and the XR were situated less than 20 m apart, and the post-calibration system bias of both was less than 1 dB. In order to eliminate random noise error and the impact of clutter, quality control was performed on the reflectivity data before analysis and correction.

When the sizes of the particles are significantly smaller than wavelength, the Rayleigh scattering approximation is valid and the reflectivity factor can be expressed as:

$$Z_{H}(mm^{6}m^{-3}) = \frac{\lambda^{4}}{\pi^{5} |k_{w}|^{2}} \int \sigma_{H}(D) N(D) dD$$
(1)

where λ is the wavelength, *D* is the volume equivalent spherical diameter, $\sigma_H(D)$ represents the radar cross section at horizontal polarization, N(D) is the number of water drops per unit volume per unit size interval, and k_w is the dielectric factor of water. The reflectivity factor in *dBZ* can be defined as:

$$Z_{H}(dBZ) = 10\log_{10} Z_{H}(mm^{6}m^{-3})$$
⁽²⁾

In these expressions, Z_H is independent of radar wavelength and is controlled by the DSD in the resolution volume. However, in reality the reflectivity factors of the same target observed by two radars at different wavelengths may be different because of factors including attenuation, non-Rayleigh scattering, differences in resolution volumes, system errors, and random error. Among these, system and random errors can be removed by calibration and quality control. For the non-Rayleigh scattering effect, Nakamura [34] and Chandrasekar [35] analyzed the difference between the equivalent reflectivity factor and the reflectivity factor, while Lhermitte [3] showed that for precipitation with a rainrate of 10 mm/h, reflectivity factors measured by centimeter-wavelength radar and Ka-band radar are almost the same. For precipitation with a rainrate of 100 mm/h, the reflectivity factor measured by Ka-band radar is ~40 *dB*, while for centimeter-wavelength radar it is ~50 *dB*; therefore, the differences in reflectivity factors due to non-Rayleigh scattering are usually less than 10 *dB*. Differences in the resolution volumes of the two radars, which result from different beam widths and range resolution widths, also result in different reflectivities.

2.2 VTC development

Without the impact of attenuation, variation trends in the reflectivity factors of MMCR and XR should generally be identical. This has been indirectly confirmed by numerous studies that took the reflectivities of longer wavelength radar as 'true' values to evaluate attenuation retrieval methods for shorter wavelength radar [eg.36-38]. On this basis, it is reasonable to correct the reflectivity of MMCR for attenuation by using the variation trends in XR reflectivity as constraint. The VTC method was developed in four steps:

Step 1: to enable attenuation correction using data collected by radar at another site, MMCR and XR radar data in constant altitude plan position indicator (CAPPI) were converted from the polar coordinate system into the absolute geographic coordinate system, and from a conical scanning surface to a constant altitude plane.

Step 2: along each constant line of longitude or latitude in the overlap region, the reflectivity profiles of both radars were decomposed at different scales using wavelet analysis in order to produce the low frequency component(CA_{nnm}) and high frequency component (CD_{nnm}) of the MMCR reflectivities, and the low frequency component of the XR reflectivities (CA_{x}).

Step 3:a weighted summation method was applied to adjust the CA_{mm} with respect to CA_{χ} using the expression:

$$CA_{mm} = W_{mm} \times CA_{mm} + W_X \times CA_X \tag{3}$$

where CA'_{mm} is the adjusted low frequency component of the MMCR reflectivities, and W_{mm} and W_X are the weight coefficients of CA_{mm} and CA_X , respectively. In order to preserve variation details in the uncorrected MMCR reflectivities to the greatest extent possible, a weight coefficient selection methodology based on the principal of maximum energy was utilized to determine W_{mm} and W_X adaptively. The square sum of wavelet coefficients was calculated using a 5-point sliding window of CA_{mm} and CA_X using the expression:

$$C_{mmi} = \sum_{j=i-2}^{i+2} CA_{mmj}^2$$
, and (4)

$$C_{Xi} = \sum_{j=i-2}^{i+2} CA_{Xj}^2$$
(5)

where CA_{mmj} and CA_{xj} are the wavelet coefficients of point j in CA_{mm} and CA_x , respectively. The greater the energy of the wavelet coefficients, the greater the level of detail that will be retained. The weights of point i are calculated by:

$$W_{mmi} = \frac{C_{mmi}}{C_{mmi} + C_{Xi}}, \text{ and}$$
(6)

$$W_{Xi} = \frac{C_{Xi}}{C_{mmi} + C_{Xi}} \tag{7}$$

Therefore, at point i, equation (3) can be transformed into:

$$CA'_{mmi} = W_{mmi} \times CA_{mmi} + W_{Xi} \times CA_{Xi}$$
(8)

Step 4:the corrected reflectivity profiles of the MMCR $P_{(Z_{nm})}$ were reconstructed with the adjusted low frequency component (CA_{mm}) and the original high frequency component (CD_{mm}) using the expression:

$$P_{(Z_{mm})} = \operatorname{Re} construction(CA_{mm}, CD_{mm})$$
(9)

3. Results and Discussion

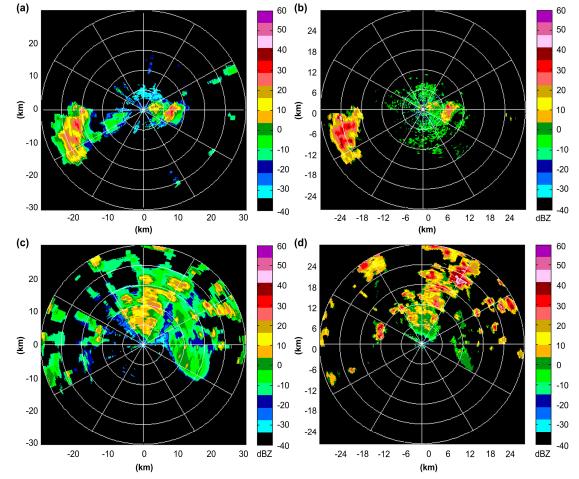
3.1 Attenuation and differences in reflectivity

Data were selected when the difference between the observation times of the two radars was less than 3 min, and when the difference between observation elevations was less than 0.1° . From 25 July 2010 to 30 July 2010, there were 116 matching pairs of plan position indicator (PPI) data. Statistical analysis showed that the mean reflectivity factors of the MMCR were significantly lower than that of the XR (by 13.58 *dB*), with a correlation coefficient of 0.46 (Table 2).

Table2. Differences between reflectivity factors of MMCR and XR ^a						
Statistics Radar	Reflectivity factors of echoes detected by both radars					
	Mean/dBZ	Std dev/dBZ	Correlation			
MMCR	-13.44	15.60	0.46			
XR	0.14	13.29				

a.Millimeter-wavelength cloud radar (MMCR) and X-band weather radar of the World Meteorological Organization (WMO) 8th radiosondes inter-comparison and integrated remote instruments experiment (July 2010, Guangzhou Province, China)

The locations of the intense echoes detected by the two radars showed good agreement (Figure 1). Compared with the XR, the MMCR detected weaker echoes, and the areas of weak echoes detected near the MMCR were larger. This higher sensitivity enabled the MMCR to observe clouds and weak precipitation (e.g., echoes observed at 235–270 ° with a range of 3–10 km; Figure 1a) that were not detected by XR. However, reflectivities and areas of intense echoes were smaller than those detected by the XR, in particular on the far side of the radar. Strong attenuation was produced by heavy precipitation; therefore, clouds and/or



precipitation behind intense echoes were not always detected (e.g., echoes at 20–30 $^{\circ}$ with a range of 24–30 km; Figure 1c and d).

Figure 1. Plan position indicator (PPI) at 6° elevation in the (a) millimeter-wavelength cloud radar (MMCR) and (b) X-band weather radar (XR) at 13:22 on 26 July 2010, and in the (c) MMCR and (d) XR at 9:18 on 28 July 2010.

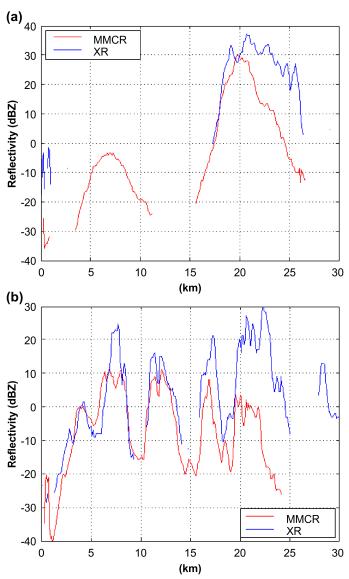


Figure 2. Comparison of radial reflectivities of the millimeter-wavelength cloud radar (MMCR) and X-band weather radar (XR) along the (a) 257° azimuth in Fig. 1a and Fig. 1b, and along the (b) 23° azimuth in Fig. 1c and Fig. 1d. Breaks in the data represent points where no echo was detected.

The radial reflectivities near the two radars showed good agreement, except for the echoes that only the MMCR detected (Figure 2). As both attenuation and the range increased, the reflectivity differences between the two radars also increased. The largest difference in reflectivity factors was observed at 39 dB (Figure 2b).

In contrast with the XR, the reflectivities of the MMCR fell significantly as distance increased, indicating that attenuation had greater impact on reflectivity than resolution volume. More specifically, attenuation always caused the reflectivity to degrade, while differences in the resolution volumes caused both increases and decreases in reflectivity.

In summary, the reflectivities of the MMCR and the XR agreed well when echoes were close, or when there were no intense echoes in the path of electromagnetic wave propagation. In contrast, when echoes were distant from the radars, or when there were intense echoes in the wave propagation path, the reflectivities of the MMCR were lower than those of the XR, primarily as a result of attenuation.

3.2 Experimental outputs

In order to assess the VTC method, MMCR CAPPI data from 3-*km* altitude between 25 and 30 July 2010 were corrected for attenuation (Figure 3). During this time interval, 56 pairs of volume scan data from the two radars had observation times that were less than 3 min apart, and these were used to test the VTC method. The results were compared with those of the bin-by-bin attenuation correction method, in which different $Z_H - A_H$ relationships were used according to Z_H [39].

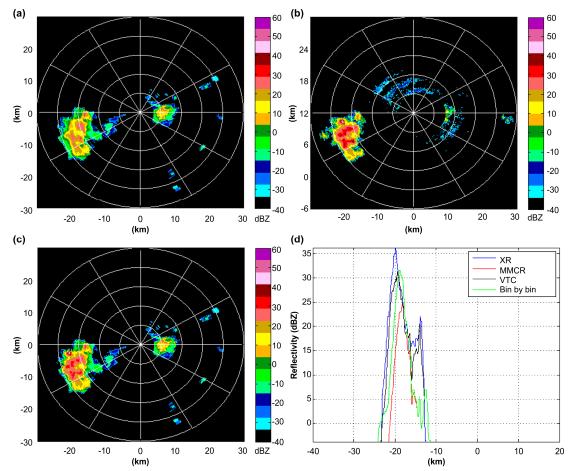


Figure 3. Constant altitude plan position indicator (CAPPI) at 3-km altitude in the 13:22 26 July 2010 reflectivity data of the (a) millimeter-wavelength cloud radar (MMCR), (b) X-band weather radar (XR), and (c)MMCR after the attenuation correction with variation trend constraint (VTC).(d) shows the comparison of MMCR reflectivities before and after VTC correction, along with data from XR and the MMCR after bin-by-bin correction along a constant line of latitude line 10km south of the MMCR.

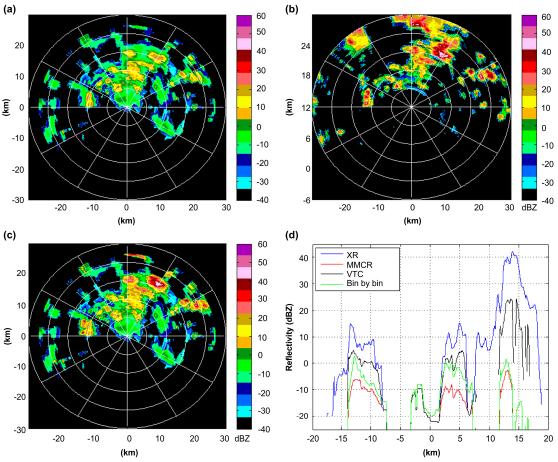


Figure 4.Constant altitude plan position indicator (CAPPI) at 3 km altitude in the 9:18 28 July 2010 reflectivity data of the (a) millimeter-wavelength cloud radar (MMCR), (b) X-band weather radar (XR), and (c) MMCR after the attenuation correction with variation trend constraint (VTC). (d) shows the comparison of MMCR reflectivities before and after VTC correction, along with data from XR and the MMCR after bin-by-bin correction along a constant line of latitude line 20 km north of the MMCR.

The reflectivities and echo areas in the MMCR data became enlarged after correction, such that the echo distribution was closer to that of the XR (Figure 2; Figure 4). Echo degradation was reduced (e.g., the echoes at 20 km range and with an azimuth of 25–35 °; Figure 4a). Comparison of reflectivity profiles along constant lines of latitude (Figure 3d; Figure 4d) showed that the VTC method made the overall variation trends in the MMCR reflectivities closer to those of the XR reflectivities, while still retaining the variation details in the MMCR reflectivities. Furthermore, the correction amplitudes of the VTC method were greater than those of the bin-by-bin method. The maximum correction value reached 27 dB (Figure 4d), which is consistent with the findings of our previous analysis.

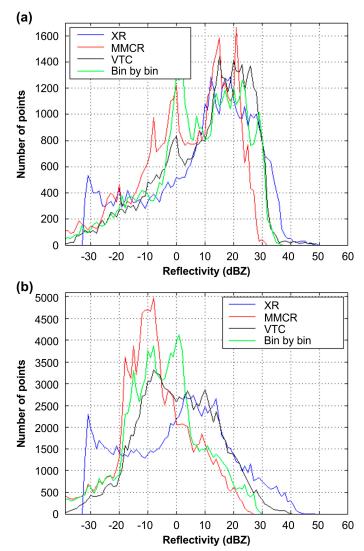


Figure 5. Histogram of reflectivities in 3-km constant altitude plan position indicator (CAPPI) of millimeter-wavelength cloud radar (MMCR) and X-band weather radar (XR) before attenuation correction, after VTC attenuation correction, and after bin-by-bin attenuation correction at (a) 13:22 on 26 July 2010 and (b) 9:18 on 28 July 2010.

The number of relatively larger reflectivity points in the MMCR data before correction were significantly lower than those in the XR data, but increased notably after correction, with the VTC correction resulting in a greater increase than the bin-by-bin method (Figure 5). After attenuation correction with the VTC method, the mean reflectivity factor of the MMCR increased significantly (by 8.98 *dB*) and becomes closer to that of the XR (Table 3); furthermore, the correlation between the 3-*km* CAPPI data of the MMCR and the XR increased notably (by 0.2). Again, the improvement using the VTC method was greater than that using the bin-by-bin method. It is important to note that because this study focuses on the correction of the reflectivities already obtained by the MMCR, and the VTC method presented here was prohibited from performing corrections where no echo was detected by the MMCR. However, without this limitation, the VTC method can recreate echoes detected by the XR but not by the MMCR. In other words, the data fusion of the two radars can be achieved.

	Statistics	Reflectivities of echoes detected by both radars			
Radar		Mean/dBZ	Std Dev/dBZ	Correlation	
XR		7.94	18.51		
MMCR	Before correction	-6.53	19.47	0.41	
	After VTC	2.45	20.62	0.61	
	After bin-by-bin	-4.16	20.58	0.48	

Table 3. Differences in MMCR and XR^a reflectivities before and after attenuation correction

a.Millimeter-wavelength cloud radar (MMCR) and X-band weather radar of the World Meteorological Organization (WMO) 8thradiosondes inter-comparison and integrated remote instruments experiment (July 2010, Guangzhou Province, China)

3.3 Impact of distance between radars

The VTC method can be used for the attenuation correction of shorter wavelength radar data assisted by longer wavelength radar data. The locations of the shorter and longer wavelength radar do not need to be the same; however, factors including the layout and wavelength differences of the two radars can affect the accuracy of the VTC method.

It is assumed that variation trends in reflectivity along the same path but detected by the radars of different wavelengths would be similar without the impact of attenuation. However, as discussed, the resolution volume difference caused by different beam widths and pulse repetition frequencies (PRF) results in "common volume" reflectivity differences. These reflectivity differences increase with increasing distance between radars, especially when the weather system is convective and has high spatial variations in reflectivity. At the same time, the distance between radars can change the "gaps" between adjacent elevations in volume scan data. This can also introduce errors into CAPPI data through interpolation, which result in errors within the final VTC method. Therefore, when using the VTC correction, the distance between the two radars should be as short as possible. However, if the "blind" detection zone above the longer wavelength radar is within the detection area of the shorter wavelength radar, then the accuracy of the VTC method will also be influenced because there will be no data to extract the variation trend in the "blind" detection zone. Therefore, the VTC method works best when the longer wavelength radar is very close to the shorter-wavelength radar, or located just near the edge of the observation range of the shorter wavelength radar.

3.4 Impact of radar wavelength differences

As the difference in wavelength between the two radars increases, the

differences in "common" volume reflectivities due to non-Rayleigh scattering also increase. However, if the difference between the wavelengths of the two radars is too low, the variation trend extracted from the reflectivities of the longer wavelength radar will be useless because the attenuations suffered by the two radars will be almost the same. Therefore, the VTC method works best when the wavelengths of the two radars are adjacent in the standard wavelength list (e.g., Ka and X band, X and C band, C and S band).

3.5 Impacts of observation time and clutter

Observation time mismatches can result in "common" volume reflectivity differences, especially when the temporal variability of the weather system is high. To address this problem, radars should operate at high scan rates. The different clutters suffered by radars can also result in reflectivity differences and effective clutter mitigation must also be performed before the VTC attenuation correction.

4. Conclusions

High-quality MMCR data are the basis of quantitative applications. To reduce attenuation-based error in MMCR data, and to address problems of unstable correction, which are inherent in conventional attenuation correction methods, a new correction methodology using variation trends as constraint was developed and evaluated. On the basis of the results, a number of conclusions can be drawn.

Compared with centimeter-wavelength radar, MMCR can detect weaker echoes; however, if intense echoes are in the wave propagation path, the reflectivity factors of MMCR will be lower than those of centimeter-wavelength radar, mainly because of attenuation. The proposed VTC method can correct the reflectivity factors of MMCR by using variation trends in the reflectivities of XR as a constraint. In this study, after correction with the VTC method, the mean value of MMCR reflectivities and the correlation with the XR reflectivities both increased, where the correction amplitude was larger than that achieved using the bin-by-bin correction method. Furthermore, the variation details in the MMCR reflectivity data before correction were effectively retained. The accuracy of the VTC method is affected mainly by the distance and wavelength differences between radars.

Future development of the VTC method will focus on the collection of additional radar data and the analysis errors caused by layout and the wavelength differences between the two radars. Data fusion of the reflectivities in MMCR and XR data using the VTC method will also be investigated in order to improve the retrieval accuracy of macro and micro cloud parameters.

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